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# Energy Aware Computing: Analysis, Optimization and Upcoming Challenges

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Abstract—Power dissipation has become a critical design concern in recent years, driven by the increased levels of complexity and emergence of mobile applications. Embedded applications are not an exception to this trend and thus, are also very much affected by the increasing power consumption and cooling and packaging costs of existing platforms for embedded computing. While it is recognized that power consumption has become the limiting factor in keeping up with increasing performance trends, static or point solutions for power reduction are prone to reach their limits eventually. The paradigm of energy aware computing is thus intended to fill the gap between gate/circuit-level and system level power management techniques, by providing more management levels and application-driven adaptability in the context of using multiple or dynamically adjustable voltages and local speeds. No less important are the challenges imposed by emerging platforms and technologies in the area of low power and energy aware computing. As a driver application, we consider wide-area computing substrates for ambient intelligent systems which provide an unexplored hardware platform for executing distributed applications under strict energy constraints. A new dimension in requirements, is that of reliability in the presence of runtime failures, thus paving the ground for achieving Dynamic Fault-Tolerance Management (DFTM) in addition to classic dynamic power management. Solutions to some of the emerging issues will be presented, along with open questions and directions for future research.

*Index Terms*—energy aware computing, fault tolerance, low power design.

#### I. INTRODUCTION

Power consumption has become the limiting factor not only for portable, embedded applications but also for high-performance or desktop systems. While there has been notable growth in the use and application of these systems, their design process has become increasingly difficult due to the increasing design complexity and shortening time-to-market. The key factor in the design process of these systems is the issue of efficient power-performance estimation that can guide the system designer to make the right choice among several candidate architectures that can run a set of selected applications.

As important as the other levels of abstraction, the microarchitectural level presents additional challenges and

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issues that need to be addressed. As such, one focus of this paper is on microarchitectural power analysis and optimization for core processors, characterized by either multimedia, or more general workloads. High-end and embedded processors are analyzed in the context of efficient design exploration for power-performance trade-off, as well as their potential for application-driven adaptability for energy-aware computation.

Another alternative to exploit fine grain microarchitectural adaptation is to use globally asynchronous locally synchronous (GALS) architectures, which attempt to combine the benefits of both fully synchronous and asynchronous systems. A GALS architecture is composed of synchronous blocks that communicate with each other only on demand, using an asynchronous or mixed-clock communication scheme. Through the use of a locally generated clock signal within each individual domain, such architectures make it possible to take advantage of the industry-standard synchronous design methodology. Not requiring a global clock distribution network and de-skewing circuitry, such systems have important advantages when compared to their fully synchronous counterparts.

Finally, challenges imposed by emerging platforms or technologies, such as electronic textiles or Ambient Intelligent systems are poised to play an important role in next generation low power or energy aware systems. We will also discuss some of these challenges in this paper, and their implications on the future design flows and methodologies.

The paper is organized as follows: Section II provides an overview of various techniques for power modeling and optimization including techniques for fine grain power adaptation at microarchitectural level, while Section IV addresses the problem of upcoming challenges imposed by emerging platforms.

# II. MICROARCHITECTURE-DRIVEN POWER ANALYSIS AND OPTIMIZATION

To characterize the quality (in terms of power and performance) of various microarchitectural configurations, we need to rely on a few metrics of interest. In the case of power consumption, most researchers have concentrated on estimating or optimizing *energy per committed instruction* (*EPI*) or *energy per cycle* (*EPC*). While in the case of embedded computer systems with tight power budgets some performance may be sacrificed for lowering the power consumption, in the case of high-performance processors this is not desirable, and solutions that jointly address the problem of low power and high performance are needed. To this end,

the energy delay product per committed instruction (EDPPI), defined as EPI\*CPI\*T<sub>cycle</sub>, has been proposed as a measure that characterizes both the performance and power efficiency of a given architecture. Such a measure can identify microarchitectural configurations that keep the power consumption to a minimum without significantly affecting the performance. In addition to classical metrics (such as EPC and EPI), this measure can be used to assess the efficiency of different power-optimization techniques and to compare different configurations as far as power consumption is concerned.

One of the most widely used microarchitectural power simulators for superscalar, out-of-order processors is *Wattch*, which has been developed using the infrastructure offered by SimpleScalar. SimpleScalar performs fast, flexible, and accurate simulation of modern processors that implement a derivative of the MIPS-IV architecture and support superscalar, out-of-order execution, which is typical for today's high-end processors. The power estimation engine of Wattch is based on the SimpleScalar architecture, but in addition, it supports detailed cycle-accurate information for all modules, including datapath elements, memory and CAM (Content-Addressable Memory) arrays, control logic, and clock distribution network. Wattch uses activity-driven, parameterizable power models, and it has been shown to be within 10% accurate when compared against three different architectures.

For accurate estimates, the power models used for the datapath modules can be based on input-dependent macromodels. The input statistics are gathered by the underlying detailed simulation engine and used, together with technology-specific load capacitance values, to obtain power-consumption values. Assuming a combination of static and dynamic CMOS implementations, one can use a cycle-accurate power macromodeling approach for each of the units of interest:

$$P_{\text{mod} ule,k} = F_{\text{mod} ule}(V_{\text{mod} ule,k-1}, V_{\text{mod} ule,k})$$
 (1)

where  $P_{\textit{module},k}$  is the power consumption of a given module during cycle k when input vector  $V_{\textit{module},k-1}$  is followed by  $V_{\textit{module},k}$ .

Today's superscalar, out-of-order processors pack a lot of complexity and functionality on the same die. Hence, design exploration to find high performance or power efficient configurations is not an easy task. As shown previously, some of the factors that have a major impact on the power/performance of a given processor are issue width, cache configuration, etc. However, as shown before, the issue window strongly impacts the power cost of a typical superscalar, out-of-order processor. The *issue width* (and corresponding number of functional units), *instruction window size*, as well as the *pipeline depth* have the largest impact as parameters in a design exploration environment.

```
design_explore (B, I, W, N)
for each benchmark BN in B{
    for IW in I = (IW1, IW2,...,IWn)
        for WS in W = (WS1, WS2,...,WSm)
    estimate_stage_latencies (IW, WS);
    if (balanced_pipeline) {
        balance_stages (IW, WS);
        estimate_metrics (BN, IW, WS, 1);
    }
    else
        estimate_metrics (BN, IW, WS, N);
}
```

Figure 1. The design exploration framework

A possible design exploration environment follows the flow in Figure 1. At the heart of the exploration framework is a fast microarchitectural simulator (estimate metrics) that provides sufficiently accurate estimates for the metric of interest. Depending on the designer's needs, this metric can be one of: CPI, CPI\*T<sub>cycle</sub>, EPI, or EDPPI, depending on whether a high performance or a joint high-performance and energy-efficient organization is sought. As shown in Figure 1, the exploration is performed for a set of benchmarks B, a set of possible issue widths I, instruction window sizes W, and a number of possible voltage levels N. For each pair (issue width, instruction window size), the stage latencies are estimated. If a balanced pipelined design is sought, the pipeline is further refined to account for this, and only one voltage level is assumed for the entire design. Otherwise, depending on the latencies of the different stages, up to Ndifferent voltages are assigned to different modules such that performance constraints are maintained, and the slowest stage dictates the operating clock frequency.

#### A. Efficient microarchitectural power simulation

For a design exploration environment to be able to explore many possible design configurations in a short period of time, it has to rely either on a smart methodology to prune the design space or on a fast, yet sufficiently accurate estimation tool for the metrics of interest.

The crux of the estimation speed-up methodology relies on a *two-level simulation methodology*: for critical parts of the code, an accurate, lower-level (but slow) simulation engine is invoked, whereas for non-critical parts of the application program, a fast, high-level, but less accurate simulation is performed. Following the principle "*make the common case accurate*," ideal candidates for critical sections that should be modeled accurately are those pieces of code in which the application spends a lot of time, which have been called *hotspots*.

**Example:** Consider the collection of basic blocks in *Figure 2*, where edges correspond to conditional branches and the weight of each edge is proportional to the number of times that direction of the branch is visited.

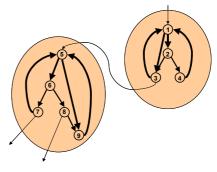


Figure 2. An example of two hotspots

Hotspots are collections of basic blocks that closely communicate one to another but are unlikely to transition to a basic block outside of that collection. In Figure 2, basic blocks 1-4 and 5-9 are part of two different hotspots that communicate infrequently to one another. As shown before, these hotspots satisfy nice locality properties not only

temporally, but also in terms of the behavior of the metrics that characterize power efficiency and performance. Temporal locality, as well as the high probability of reusing internal variables, make hotspots attractive candidates for sampling metrics of interest over a fixed sampling window after a warm-up period that would take care of any transient regimes. Estimated metrics obtained via sampling can be reused when the exact same code is run again. Although different, such an approach is similar in some ways to power-estimation techniques for hardware IPs using hierarchical sequence compaction or stratified random sampling. In addition, the relative sequencing of basic blocks is preserved, and the use of a warm-up period ensures that overlapping of traces is not necessary. This is in contrast with synthetically constructing traces for evaluating performance and power consumption.

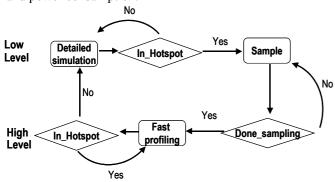


Figure 3. The two-level simulation engine

To speed-up the simulation time inside the hotspots and achieve the goal of "making the common case fast," the sampling of power and performance metrics can be used until a given level of accuracy is achieved. This is supported by the fact that while being in a hotspot, both power consumption (EPC) and performance (IPC) achieve their stationary values within a short period of time, relative to the dynamic duration of the hotspot. As experimental evidence has shown, the steady-state behavior is achieved in less than 5% of the hotspot dynamic duration, thus providing significant opportunities for simulation speed-up, with minimal accuracy loss.

Figure 3 shows how the two-level simulation engine is organized. During detailed simulation, all performance and related power metrics are collected for cycle-accurate modeling. When a hotspot is detected, detailed analysis is continued for the entire duration of the sampling period. When sampling is done, the simulator is switched to basic profiling that only keeps track of the control flow of the application. Whenever the code exits the hotspot, detailed simulation is started again. This way, the error of estimation is conservatively bounded by the sampling error within the hotspots. Performing detailed simulation outside the hotspots ensures that the estimates are still accurate for benchmarks with low temporal locality (e.g., less than 60% time spent in hotspots).

## B. Using a GALS Design Paradigm

An example of a GALS processor is shown in *Figure 4*. Groups of up to four aligned instructions are brought from the Level 1 Instruction Cache in the **Fetch** stages at the

current PC address, while the next PC is predicted using a G-share branch predictor. The instructions are then decoded in the next three pipeline stages (named here **Decode**) while registers are renamed in the **Rename** stages. After the **Dispatch** stages, instructions are steered according to their type, towards the Integer, Floating Point or Memory Clusters of the pipeline. The ordering information that needs to be preserved for in-order retirement is also added here. In **Register Read**, the read operation completes and the source operand values are sent to the execution core together with the instruction opcode.

Instructions are placed in a distributed Issue Buffer (similar to the one used by Alpha 21264) and reordered according to their data dependencies. Independent instructions are sent in parallel to the out-of-order execution core. The execution can take one or more clock cycles (depending on the type of functional unit that executes the instruction) and the results are written back to the register file in the **Write Back** stages. Finally, the instructions are reordered for in-order retirement, according to the tags received during **Dispatch**. Branches are resolved in **Write Back**, hence a minimum mispredict penalty of 14 cycles.

Of extreme importance for a GALS system is the choice of various design knobs that impact the overall power-performance trade-offs. Possible microarchitecture design knobs to consider include:

- The choice of the communication scheme among frequency islands
- The granularity chosen for the frequency islands.
- The dynamic control strategy for adjusting voltage/speed of clock domains so as to achieve better power efficiency.

For example, we show in *Figure 5* the impact of using between four and six clock domains for a typical GALS processor as described before. As it can be seen, for rather shallow pipelines (and thus, less complex systems) a smaller number of clock domains is desirable for achieving better energy delay product.

Taking this analysis even further, one can analyze the effectiveness of various partitioning strategies or dynamic control algorithms for exploiting adaptability within and across applications for optimal energy and latency control.

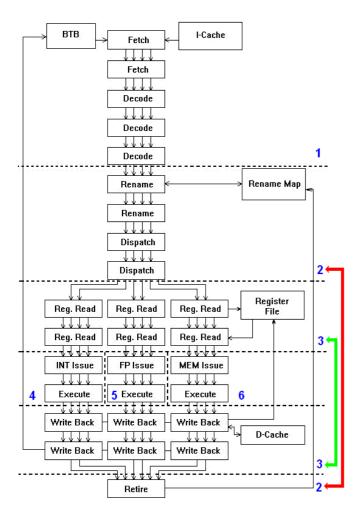


Figure 4. A possible GALS microarchitecture

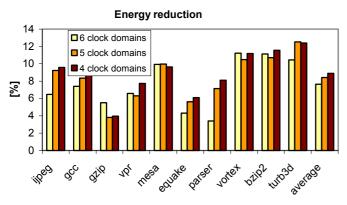


Figure 5. Energy reduction for a GALS design with 4-6 clock domains

# C. Emerging Platforms

Similar to other emerging technologies or platforms that are characterized by the need of reliable operation in the presence of unreliable components, ambient intelligent (AmI) systems or electronic textiles must be able to react and self-manage themselves in case of changes in operating conditions or environment. Being deployed in various environments or surroundings that may induce various type of faults, AmI systems have an inherently high potential for runtime failure. Such failures may range from intermittent electrical and mechanical failures at the system level, to

device failures at the chip level. Techniques to provide reliable computation in the presence of failures must do so while maintaining high performance, with an eye toward energy efficiency. When possible, they should maximize battery lifetime in the face of battery discharge non-linearities.

Via adaptive fault-tolerance management failure-prone systems and by classifying local algorithms for achieving system-wide reliability, we can assess the viability of various dynamic fault tolerance management strategies, as well as the appropriateness of different metrics characterizing fault tolerance. For example, while it is always possible to just look at the effective application lifetime achieved by a set of policies, we claim that doing so without including possible finite battery budgets and nonlinearities, provides misleading results. Figure 6 shows a comparative view of the overall system lifetime (Figure 6(a)) and mean computation (per Watt) before battery failure (Figure 6(b)) for six experiments employing various combinations of policies. While system lifetime analysis shows exp.3 as the best, when looking at the actual amount of work performed, exp.7 is the best. At the same time, while exp.8 fares worse than exp.3 and exp.7 in terms of overall system lifetime, is comparable in terms of useful computation (per Watt) performed.

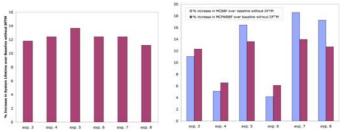


Figure 6. System lifetime vs. mean computation (per Watt) before battery failure

Thus, while local policies for enabling DFTM are important, the choice of the metric is even more critical for correctly characterizing the best design point in terms of energy delay product.

In addition, directions that address the challenges of incorporating fault-tolerance as a design constraint are needed and should be the objective of future research.

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# Energy-Efficient Scheduling for Hard Real-Time Applications on Dynamic Voltage Supply Processors

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Abstract—The common energy reduction techniques imply trading performance for power, giving the impression that timeliness and energy efficiency are opposing goals. However with the advent of Dynamic Voltage Supply processors, even hard real-time systems can become energy efficient if adequate methods are employed. This paper reviews several such scheduling techniques, addressing speed selection at both individual task and task group level, applicable at run-time. Additionally, a couple of more advanced techniques, making use of run-time task variation are also briefly presented.

#### I. INTRODUCTION

As the consumers demand more and more functionality from their lap-tops, PDAs, cellular phones, other mobile devices, and household appliances, reducing the energy consumption becomes an essential issue for embedded systems design. In this context, Dynamic Voltage Supply (DVS) processors seem to offer the best combination of flexibility and energy efficiency. However, with the new dimension of processor speed (clock and supply voltage) introduced by these, special scheduling strategies are required to take full advantage of the available features. In the last couple of years the research on dynamic voltage scheduling has flourished, becoming a mature area, waiting for the consumer market to catch up. This paper reviews a number of such speed scheduling techniques, covering a rather wide spectrum of approaches from task to group level, from static to dynamic methods, including more complex, probabilistic techniques. All of the strategies presented in here exclusively address speed scheduling, without touching on compilation for low energy, power management, or low power communication. Furthermore, we focus on hard real-time scheduling techniques.

The paper is organized as follows. Section II introduces the hardware support for speed scheduling, namely the DVS processor with its advantages and drawbacks. Speed scheduling methods for both task and task group level are reviewed in Section III, which is the main part of the paper. Finally, we summarize and conclude with Section IV.

#### II. HARDWARE SUPPORT

A wide variety of DVS processor systems are available today on the market or as prototypes [1], [2], [4]–[6]. Although their main characteristic is the ability to adjust their speed (core clock frequency and voltage) at run-time, different solutions achieve this in various ways. The number of speed settings

is limited, varying between two (*Intel SpeedStep*) and tens of speeds (*Transmeta Crusoe*). Often these speed settings are not on the same ideal delay-voltage curve, due to the discrete increments for both voltage and clock frequency (Fig. 1). Furthermore, only some parts of the processor are able to

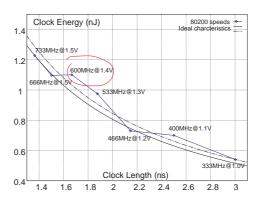


Fig. 1. Measured data for Intel 80200 speed settings as energy-clock length points compared to ideal (non-discrete) characteristics. The circled setting is in fact obsolete, being covered by the point on the left.

operate at different speeds, while others, such as the I/O pads, need to satisfy certain standards. Additionally, a speed switch has different characteristics for different processors or even for different initial and final speeds. The most important in our case is arguably the switch latency, which spans from tens of  $\mu s$  to milliseconds. The limiting component is often the Delay Loop Logic (DLL) or Phase Lock Logic (PLL), which takes time to re-lock on the new clock frequency. However, the energy overhead of a speed switch is usually very small, since the only active part during the switch is the clock generation logic.

Common speed scheduling techniques make several simplifying assumptions, such as negligible overhead speed switches and continuous range of speeds. These are not always limiting, and might become closer to reality with newer generations of processors, as we briefly show later on.

#### III. SPEED SCHEDULING

Scheduling tasks for DVS processors implies both time and speed setting (clock frequency and the corresponding supply voltage). For hard real-time systems the main requirement is keeping the deadlines, regardless of how fast the tasks can run. In this context, good speed scheduling techniques take advantage of the idle times to slow down the processor speed, thus saving energy.

The large variation of speed scheduling methods makes it possible to classify them in different types. Depending on the scheduling decisions, one can distinguish between offline (static) and run-time (dynamic) or between operating system level and user level approaches. Depending on the task characteristics, one can find methods for fixed or variable execution pattern, hard or soft deadlines. Depending on the level of intrusion, there are control flow aware approaches or instance history sensitive techniques. Note that the distinctions are not necessarily mutually exclusive, as typical approaches encountered in current research combine several of these features at different time moments or abstraction levels. Finally, one can distinguish also between intra-task (or task level) techniques, which are oblivious of the existence of other tasks in the system, and inter-task (or task-group level) techniques, which perform scheduling at system level. We review some representative methods from the two different classes in the following.

#### A. Intra-Task Approaches

At task level, deciding a speed schedule implies finding an assignment of each task clock cycle to an available speed, while meeting a deadline. Without any scaling, all cycles would execute at the fastest speed, finishing before the deadline (Fig. 2.a). If the exact execution time is known before the task starts executing, the ideal speed would be the one making the task to finish exactly at the deadline (Fig. 2.b). <sup>1</sup> When only the worst case behavior is known, one might still be able to run the task at a lower speed and still meet the deadline (Fig. 2.c).

For tasks with variable execution pattern, it turns out that there are better speed schedules than the ones using constant speeds, as the ones mentioned until now. Accelerating schedules (Fig. 2.d) start from a low speed and, as the task keeps executing towards its worst case, the speed is increased such that the deadline is still kept even for the worst case. Usually such schedules are non-intrusive, needing no other information about the task than its execution history or execution pattern distribution [9], [12]. Furthermore, these schedules can be decided entirely before the task starts executing and might be exclusively employed at run-time, making them prone for implementation in an Os. Since they minimize the average case energy and use probabilities to decide the speeds, these schemes are usually referred to as *Stochastic Schedules*.

Finally, there are also techniques that start with a high speed and decelerate towards an ideal speed, as more and more information about the execution path becomes available

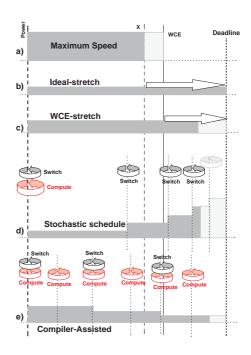


Fig. 2. A Few Intra-Task Schedule Types

(Fig. 2.e). These are usually intrusive techniques, that have to examine the task control flow, choose the points that are good candidates for adjusting the speed (branching points affecting the remaining worst case execution time) and insert code for speed switching [13], [15]–[18]. Since the best moment to examine the control information of a task and insert new code is at compile time, these techniques are usually referred to as *Compiler Assisted* methods. Note that for this methods, every instance energy is minimized, requiring special tools to insert speed switching points.

Neither of the above methods is the best for all cases, depending very much on the task characteristics, tools support, and many other parameters, as presented in [10]. Combinations of the last two presented approaches can also be imagined, since both sides strive to acquire more and more of the advantages of the other. In particular, letting the operating system to perform the actual speed switching according to the suggestions made by individual tasks is a more effective way to reduce energy, since the Os has a more complete view of the whole system [8], [14].

## B. Task-Group Techniques

Classic task-group scheduling techniques are designed for tasks with fixed execution time. Although using these combined with intra-task scheduling methods may reduce the energy consumption, special techniques, especially designed to decide both the speed and task timing, are potentially more efficient. Task-group speed scheduling techniques are able to detect and reuse idle times, as well as better balance the energy load on heterogeneous systems.

At this level, one can identify techniques designed for task

<sup>&</sup>lt;sup>1</sup>Since the number of available speed settings is limited, it is very likely that the ideal speed is not among the available speeds. However, as shown in [11], virtual speeds can be achieved by using two of the available speeds, bounding the desired ideal speed. For this reason, we will, from now on, assume that any speed is achievable between the maximal and minimal ones.

graphs, task sets, or hybrid models such as multi-rate graphs. Usually task graph methods are concerned with communicating tasks on multi-processor systems, with a unique rate, suitable for a static cyclic executive approach. On the other hand, task set techniques emphasize timing (response times) on uni-processor systems, involving both static analysis and run-time scheduling. Regardless of the model, the majority of speed scheduling approaches have both a static and a dynamic (run-time) part. Predominantly static techniques are easier to analyze and derive, being however less flexible. Dynamic approaches exhibit increased run-time overhead and are harder to analyze, but can adapt better to workload variations. In this context, we start describing simple static scheduling methods (task graph based) and continue with more complex and dynamic methods (task set based).

1) Static Scheduling Methods: The simplest case is that of uni-processor scheduling of a group of tasks with unique period and deadline. The ideal schedule in this case (analog to Fig. 2.b and c) is the one with constant speed, finishing exactly at the deadline. A similar method, named Proportional Stretch, can be applied to task-graph on multi-processors. First these are scheduled using a classic technique (i.e. list-scheduling), and the resulting schedule is then proportionally stretch to the deadline, reducing the speeds of all tasks with the same factor. However this method is sub-optimal for heterogeneous systems and schedules with slack on the non-critical path.

More specialized techniques are able to overcome the problems mentioned above [22], [23]. The LENES approach, introduced in [19], is a list scheduling based algorithm, with a special energy-aware priority function. The start and end of each task are treated as separate graph nodes, being scheduled or delayed for a later time depending on the global energy of the partial schedule. With LENES, energy savings between 10% and 28% off the non-scaling case can be achieved, even for the tightest possible schedule. Additionally, it is possible to combine static speed scheduling with task to processor mapping in an energy-aware system design flow, yielding further energy reductions [21], [25].

2) Dynamic Scheduling Methods: For sets of tasks with different rate, deadline and variable execution time static methods cannot handle the idle times (slack) that appears in the system at run-time. In this case dynamic speed scheduling strategies must be employed, usually built on top of classic real-time scheduling techniques such as Rate-Monotonic Scheduling (RMS) [32] or Earliest Deadline First (EDF) [33]. The majority of these techniques employ both offline and runtime decisions. Offline procedures usually include assigning bounds to task speeds and response time analysis for different run-time strategies. Run-time decisions concern exact speed assignment and slack management. Some of such speed-related offline and run-time decisions are actually standalone, and can be easily plugged in the classic real-time strategies.

Deciding the Maximum Required Speeds (MRS) for RMS [9], [26] and EDF [27], [30] is an offline analysis technique that can suggest the upper bound on each task speed, such that all the deadlines are met. However, at this point all tasks

are assumed to be running their worst case, and therefore an additional run-time strategy would take advantage of the slack appearing from tasks running faster than their worst case.

A RMS-based run-time speed scheduling strategy for a two-speed processor is described in [24]. [26] presents an improved method, that runs lone tasks as slow as possible until the arrival of a next task instance. Fixed-priority scheduling has been further investigated in [9], [29], [31].

The slack management strategy presented in [9] uses slack levels to accumulate idle times, corresponding to priorities. Task instances can use slack from higher levels than their own priority and produce lower priority slack if they finish early. The approach was proven to keep the response times from the classic RMS. Additionally, there are various ways to distribute the available slack to the instances about to execute, such as *Greedy*, if the next instance uses all the slack and *Mean Proportional*, if the slack is distributed according to the expected execution time. Furthermore, this strategy can be combined with intra-task speed scheduling for higher efficiency. Following a similar approach, EDF-based speed scheduling techniques were also developed [27], [28], [30].

#### C. Advanced Methods

It is important to notice that most speed scheduling techniques are basically classic scheduling strategies modified to take into account idle times and run tasks slower when possible. Task management (priorities, preemption, etc. ) are still performed as in classic scheduling. However, there are techniques that use additional information about the tasks to modify the task management and reduce the energy even more. For tasks with variable execution pattern, knowing the expected execution time or probability distribution can help derive more efficient schedules, such as the stochastic schedule from section III-A. Similar principles can be applied to task groups, as proven by Uncertainty Based Scheduling (UBS) [20]. Designed for task sets with unique rate and deadline running on uni-processor systems, UBS is based on the observation that the energy consumption depends on the order of executing tasks. In particular, short tasks and tasks with highly variable execution should run first, in order to achieve a ideal constant speed as soon as possible. An example of average energy consumption for a set of six real life tasks with different orders, including UBS and variable (random) order, running on a XScale i80200 platform [3] is presented in Fig. 3. An extension of UBS to EDF is described in [30].

#### IV. SUMMARY AND CONCLUSIONS

A wide spectrum of speed scheduling techniques for hard real-time systems were presented, ranging from task level techniques to task group level approaches. At task level we reviewed compiler assisted methods and stochastic scheduling. At task group level we looked at both task graph and task set scheduling. For task graphs we emphasized LENES, along with other static techniques. For task sets we mentioned offline (MRS) and run-time strategies for RMS and EDF. Finally, UBS was singled out as an advanced speed scheduling strategy.

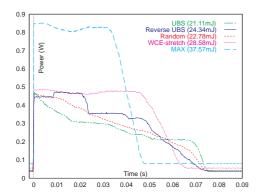


Fig. 3. Average power profile for six tasks on i80200, running according to different orders: UBS, its inverse order, variable order, minimal constant speed to meet the deadline in all cases and maximal speed.

To conclude, it is most likely that very soon most processors will be DVS processors. A large number of speed scheduling techniques are already available out there, covering most of the situations or problem set-ups. Although improvements are possible, expect further energy reductions to be minimal, since the nature of the problems requires larger and larger efforts for rapidly decreasing results. However, examining the impact of speed scheduling techniques at system and even network level appears to be a tempting research area. Combining task management (migration, duplication) in wireless networks with DVS techniques and power management seem to offer even more possibilities for energy reduction. Minimizing the speed switching overhead is also a must, as the processors become faster and faster.

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# Dynamic Voltage Scaling for Hard Real-Time Systems

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Abstract—Dynamic voltage scaling (DVS), which adjusts the supply voltage and clock frequency dynamically, is an effective technique for designing low-power embedded real-time systems. In this lecture, we discuss recent DVS techniques at various design abstractions targeting for hard real-time systems. Following a brief introduction to low-power system design techniques in general, we cover DVS techniques from three software levels, the operating system level, the compiler level and the algorithm level. Experimental results show that DVS can achieve significant energy reductions in hard real-time systems.

Index Terms— dynamic voltage scaling, low power, hard real-time systems.

#### I. INTRODUCTION

Energy consumption is one of the most important design constraints in designing battery-operated embedded systems such as digital cellular phones and digital cameras. For such systems, the energy consumption is a critical design factor because it directly affects the system's lifetime.

The dynamic energy consumption E, which currently dominates the total energy consumption of CMOS circuits, is given by  $E \propto C_{\rm L} N_{\rm cycle} {V_{\rm DD}}^2$ , where  $C_{\rm L}$  is the load capacitance,  $N_{\rm cycle}$  is the number of executed cycles, and  $V_{\rm DD}$  is the supply voltage. Because the dynamic energy consumption E is quadratically dependent on the supply voltage  $V_{\rm DD}$ , lowering  $V_{\rm DD}$  is an effective technique in reducing the energy consumption. However, lowering the supply voltage also decreases the clock speed, because the circuit delay  $T_{\rm D}$  of CMOS circuits is given by  $T_{\rm D} \propto V_{\rm DD} / (V_{\rm DD} - V_{\rm T})^a$ , where  $V_{\rm T}$  is the threshold voltage and a is a technology dependent constant [1].

When a given task does not require the maximum performance of a system, the clock speed (and its corresponding supply voltage) can be dynamically adjusted to the lowest possible level that still satisfies the task's required performance. This is the key principle of the dynamic voltage scaling (DVS) technique [2]. With an ever-growing importance of the power/energy consumption in portable embedded systems, many DVS algorithms (e.g., [3]-[7]) have been proposed. At the same time, several commercial variable-voltage processors were developed as

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well (e.g., Intel's *Xscale*, AMD's *K6*–2+, and Transmeta's *Crusoe* processors).

A generic DVS algorithm consists of two steps, the slack (i.e., idle interval) estimation step and slack distribution step. The slack estimation step tries to identify as much slack times as possible while the slack distribution step aims to distribute the identified slack times in such a fashion that the resulting speed schedule is as uniform as possible. Slack times generally come from two sources; static slack times are the extra times available that can be identified statically, while dynamic slack times are caused from run-time variations of executions.

In this lecture, we cover various DVS techniques proposed for *hard* real-time systems. For hard real-time systems, the goal of voltage scaling algorithms is to find an energy-efficient voltage schedule with all the stringent timing constraints satisfied. We cover DVS techniques from all three software layers, namely, the operating system level, compiler level, and algorithm level.

The rest of this extended abstract is organized as follows. In Section  $\Pi$ , we describe the overall organization of the lecture and summarize the main topics of the lecture. Additional information on the presented topics is given in Section  $\Pi$ .

#### II. LECTURE ORGANIZATION

#### A. Overview of Lecture

As shown in Figure 1, the lecture consists of four parts. In Part I, we review the main sources of power consumption in CMOS circuits and introduce the principle of power-aware software computing. In Parts II and III, as concrete examples of the principle described in Part I, we present several low-power techniques based on switching activity reduction and battery characteristics. They include low-power register relabelling techniques, operation rearrangement techniques for VLIW processors and battery-aware balanced modulo scheduling [8][9].

Part IV, which covers the main topic of this lecture, is organized in three sections. In the first section, we focus on intra-task DVS in which the supply voltage is adjusted within a task boundary. Since the execution speed is changed for a single task, intra-task DVS techniques are implemented in the compiler level.

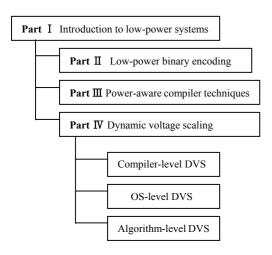


Fig. 1. Overall organization of the lecture.

In the second section of Part IV, we study inter-task DVS algorithms which is implanted in the operating system level. Unlike intra-task DVS, inter-task DVS algorithms determine the voltage on a task by task basis at each scheduling point. Therefore, once a speed is assigned to a task, its speed is not changed unless it is rescheduled by OS.

In the last section of Part IV, we present a low-power implementation of an image convolution operation which takes advantages of variable voltage processors. An image convolution algorithm is a typical example of algorithms that exhibit no workload variations. For such algorithms, unless properly modified, DVS cannot be effectively utilized. This section gives a good example of how to modify such algorithms for variable voltage processors.

#### B. Compiler-level DVS

Intra-task DVS can be supported both in the compile time and run time. In this lecture, we focus on a compile-time technique which completely hides DVS-related idiosyncrasy from high-level language programmers. The discussed technique [10], which is based on static execution-time analysis techniques, is novel in that (1) it automatically converts a given program to a low energy version and (2) fully exploits slack times. Based on the discussed technique, we describe a prototype DVS tool, Automatic Voltage Scaler (AVS) which transforms a DVS-unaware program into a DVS-aware low-energy version with all the timing constraints of the original program satisfied.

#### C. OS-level DVS

Inter-task DVS algorithms exploit the "run-calculate-assign-run" strategy to determine the supply voltage. When the current task completes its execution, an OS scheduler calculates the maximum allowable execution time for the next task. Based on the execution time computed, an appropriate supply voltage is assigned to the next task. The maximum allowable execution time of a task is given by the sum of the worst-case execution time of the task and the slack time available for the task. In the lecture, we cover various techniques proposed for computing the maximum allowable execution time for a given hard real-time task [11]. Using two DVS evaluation environments, Simulation

Environment for DVS (SimDVS) and DVS Evaluation Workbench (DEW), we compare the energy efficiency of various DVS algorithms and discuss system overheads of using DVS. In the lecture, we focus on preemptive hard real-time systems in which periodic real-time tasks are executed under the Earliest-Deadline-First (EDF) or Rate-Monotonic (RM) scheduling policies.

#### D. Algorithm-level DVS

As an example of DVS-aware algorithm development, we cover a low-power implementation of image convolution algorithm for variable voltage processors. Although DVS-aware algorithm development is largely dependent on the creativity of an algorithm developer, we illustrate that a significant energy saving is possible by optimizing an existing algorithm for variable voltage processors.

Since an image convolution algorithm is a constant workload algorithm (i.e., no workload variations depending on inputs), we first modify the order of computing convolution sums so that the modified algorithm can exhibit workload variations depending on a given input. The modified convolution algorithm significantly reduces the number of executed cycles, thus lowering the execution speed. In addition, it also decreases the number of memory accesses. With all three factors combined, the modified image convolution algorithm achieves a high energy saving ratio over the original image convolution algorithm.

#### III. ADDITIONAL RESOURCES

In large parts, the lecture is based on several research projects conducted at the Computer Architecture and Embedded Systems Laboratory (CARES), Seoul National University, Seoul, Korea. For further information on the lecture, you may consult the publication section of the CARES Web homepage at <a href="http://davinci.snu.ac.kr/new/publication">http://davinci.snu.ac.kr/new/publication</a> where on-line versions of many related papers are available. The CARES homepage currently does not include any information on the research tools (such as SimDVS), but we plan to make them available on the Web as well.

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# **Designing Energy Aware Systems**

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#### **Abstract**

The design of power-efficient systems has been a main concern for industrial designers and has been the focus of many academic and industrial labs. Power consumption has a significant impact on various aspects of the system such as power grid design, packaging and cooling, battery lifetime and system reliability. First, we will provide an overview of the metrics and tools used for power estimation. The second part of this proposal shows the need for a holistic power optimization approach that spans from circuit to software design issues. We illustrate this showing power optimizations applied to the memory system.

**Index Terms:** low power design, estimation tools, memory system, leakage power.

#### 1 Introduction

The design of computing systems needs to consider various factors such as performance, cost, power dissipation and reliability. Among these power dissipation is considered as the biggest stumbling block in designing the next generation systems. Power problems are a significant issue ranging from small sensors to large compute servers. However, the underlying reasons for their importance are different.

In small embedded and mobile systems, the limited battery capacity is a main concern. The battery technology improvements have not matched to the increasing power requirements of the computing resources. Current lithiumion batteries provide only 100W-hr per pound compared to around 10W-hr/lb capacities in the 1960's. In contrast, the power consumption numbers of the processors have increased from much less than a watt in 1970s to around 100Watts in current microprocessors. Consequently, battery technology has been a bottleneck making the battery pack a dominant part of the system weight and influencing the duration required between battery recharges.

Power dissipation has become an important issue in desktop systems and server environments for a variety of other reasons. The increasing power density due to the miniaturization of the circuits makes the task of packaging and cooling harder and costlier. Higher power densities also translate to higher on-chip temperatures and make it necessary to support costlier packaging. Power and cooling

requirements are also a major bottleneck for many data centers and is considered a significant part of the operating cost. The higher power densities also degrade system reliability. Furthermore, the increasing current draw poses difficulties in the power supply grid design.

## 2 Sources of Power Consumption

The three main sources of power consumption in a CMOS chip occur due to the switching activity of the signals, short-circuit current and leakage currents. Power is consumed whenever current is drawn to charge a node or wire from zero to one. This is referred to as the dynamic power consumption and is represented as  $CV^2f$ , where C is the capacitance of the node or wire being switched, V is the voltage swing associated with a change from a logical zero to a logical one and f is the operating frequency. Dynamic energy consumption has been the dominant source of power consumption and has been the focus of most power optimization efforts. The second source of power consumption is due to the short-circuit current that flows when both the pull-up and pull-down circuits are both on for a short duration when the inputs are changing. Short circuit current is not a major concern for well designed circuits. The third source of power consumption is due to leakage current that flows even when the transistors are turned off. Leakage power is consumed immaterial of whether there is switching activity or not and is becoming a major concern with the scaling down of threshold voltages and the reducing thickness of the gate oxide.

In order to reduce power consumption, tools for estimating the various sources of power consumption are essential. The estimation tools are useful in identifying the components that are problematic from a power consumption perspective and in evaluating the effectiveness of optimizations proposed to overcome these problems. The power estimation tools can be used at different stages in the system design (See Figure 1). Tools for accurate power-performance prediction are essential for designing power-aware architectures, compilers, run-time support, communication protocols, and applications. Currently, there are tools to measure the power at either a very fine-grain (circuit or gate) level or coarse-grain (procedural or program) level. With fine-grain estimation, it is difficult or impossible to measure power usage in (future) billion transistor designs or for large programs. However, this is the most accurate approach to power estimation. On the other hand, coarse-grain measurements can only give gross estimates, but do so quite efficiently.

At the earliest stage of the design, power is estimated for a given system with little implementation detail at the architectural level. Architectural power simulators have been typically built on top of performance simulators that keep track of accesses to the different components in the architecture and obtain the power consumption by modeling the per access energy cost of a single access for each component. The models for the different components are built using the structure, bitwidth and design style. For example, the power consumed for a cache access can be modeled using information such as the size of the cache, the number of ports and the use of single-ended or double-ended sense amplifiers for reading the data. Examples of architectural level estimation tools include Simplepower [24], Softwatt, Wattch [2] and Wattwatcher.

Once the RTL and the corresponding gate level implementation of the architecture are available more accurate power estimation is possible. Even at this level actual layout or circuit implementation is not available and gate and wiring capacitances are estimated using models. Gate capacitances are modeled using the sizing information while wire loads are obtained from number of pins incident on the net and based on placement information. The switching activity at the nodes is estimated through simulation. Once capacitance and switching information is available the dynamic power estimation can be performed.

Later in the design cycle, even more accurate estimates can be obtained at the circuit level as more information is available to make estimates of the capacitance more accurately. However, estimation at the higher levels is becoming more and more important as power problems identified later in the design cycle are hard to fix. Consequently, tools for estimating the power at the earliest stage of design are becoming popular. Since software is becoming an integral part of most systems, tools for estimating the power consumed by software and the influence of software optimizations on the power consumption behavior have also become important.

These tools also help to identify the specific components that pose the main concern from a power consumption perspective. In many embedded systems, the design of the memory system is a critical factor influencing the power consumption profile. The rest of this paper shows how memory power optimizations can be reduced at different levels of system design.

#### 3 Memory Power Optimizations

A host of hardware optimizations have been proposed to reduce the energy consumption. Focusing on SRAM memories, common techniques used for optimization include partitioning the memory into smaller parts, dividing the bit lines, dividing the word lines and using reduced voltage swings [12]. Two common optimizations applied to cache memories are block buffering [17] and cache subbanking [23]. In the block buffering scheme, the previously accessed cache line is buffered for subsequent accesses [17]. If the

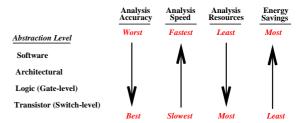


Figure 1. Comparison of Energy Optimizations at Different Levels.

data within the same cache line is accessed on the next data request, only the buffer needs to be accessed. This avoids the unnecessary and more energy consuming access to the entire cache data and tag array. Multiple block buffers can be thought of as a small sized Level 0 cache. In the cache subbanking optimization, which is also known as column multiplexing [23], the data array of the cache is divided into several subbanks and only the subbank where the desired data is located is accessed. This optimization reduces the per access energy consumption.

A common power optimization technique employed in DRAM memories include the support for multiple low power modes. Each mode is characterized by its *power consumption* and the time that it takes to transition back to the active mode (*resynchronization time*). Typically, lower the energy consumption, higher the resynchronization time [1]. These modes are characterized by varying degrees of the module components being active. The power mode transitions can be effected either by hardware or through software.

In the hardware approach, there is a Self-Monitoring and Prediction Hardware block which monitors ongoing memory transactions. It contains some prediction hardware to estimate the time until the next access to a memory bank and circuitry to ask the memory controller to initiate mode transitions. Limited amount of such self-monitored power-down is present in current memory controllers (e.g., Intel 82443BX [13]). The specific details of different prediction mechanisms that can be employed is given in [7]

In the software-directed approach, the memory controller is explicitly told to issue the control packets for a specific module's mode transitions. A set of configuration registers in the memory controller that are mapped into the address space of the CPU (similar to the registers in the memory controller in [13]) are used to set the power mode. Programming these registers using one or more CPU instructions (stores) would result in the desired power mode setting. The power modes are set based on analyzing the code and data access patterns using the compiler.

In addition, it is also possible to use code optimizations to improve the effectiveness of the power mode control. For example, all data accessed can be clustered together in a single module instead of being scattered across in different modules. This enables to put the unused modules into a lower power mode.

# 4 Reducing Leakage Energy

There have been several efforts spanning from the circuit level to the architectural level at reducing the cache leakage energy. Circuit mechanisms include adaptive substrate biasing, dynamic supply scaling and supply gating. Many of the circuit techniques have been exploited at the architectural level to control leakage at the cache bank and cache line granularities.

The approaches that target reducing cache leakage energy consumption can be broadly categorized into three groups: (i) those that base their leakage management decisions on some form of performance feedback (e.g., cache miss rate) [19], (ii) those that manage cache leakage in an application insensitive manner (e.g., periodically turning off cache lines) [8, 15, 16], and (iii) those that use feedback from the program behavior [15, 27, 25, 11].

The approach such as DRI I-Cache [19] in category (i) is inherently coarse-grain in managing leakage as it turns off large portions of the cache depending on a performance feedback that does not specifically capture cache line usage patterns.

Approaches in category (ii) turn off cache lines independent of the instruction access pattern. An example of such a scheme is the periodic cache line turn-off proposed in [8]. The success of this strategy depends on how well the selected period reflects the rate at which the instruction working set changes. Specifically, the optimum period may change not only across applications but also within the different phases of the application itself. A second example of a fixed scheme in category (ii) is the technique proposed in [16]. This technique adopts a bank based strategy, where when execution moves from one bank to another, the hardware turns off the former and turns on the latter. Another technique in category (ii) is the cache decay-based approach (its adaptive variant falls in category (iii)) proposed by Kaxiras et al [15]. In this technique, a small counter is attached to each cache line which tracks its access frequency. If a cache line is not accessed for a certain number of cycles, it is placed into the leakage saving mode. While this technique tries to capture the usage frequency of cache lines, it does not directly predict the cache line access pattern. Consequently, a cache line whose counter saturates is turned off even if it is going to be accessed in the next cycle. Since it is also a periodic approach, choosing a suitable decay interval is crucial if it is to be successful.

The approaches in category (iii) attempt to manage cache lines in an application-sensitive manner. The adaptive version of the cache-decay scheme [15] tailors the decay interval for the cache lines based on cache line access patterns. They start out with the smallest decay interval for each cache line to aggressively turn off cache lines and increase the decay interval when they learn that the cache lines were turned off prematurely. These schemes learn about premature turn-off by leaving the tags on at all times. The approach in [27] also uses tag information to adapt leakage management. In [25], an optimizing compiler is used to analyze the program to insert explicit cache line turn-off instructions. This scheme demands sophisticated program analysis and modification support, and needs modifications in the ISA to implement cache line turn-on/off instructions.

Further, Hu et al., in [11], proposed a hotspot based leakage management scheme to capture the dynamic phase execution information of the running program for directing leakage control and a just-in-time activation scheme to significantly reduce the performance overhead due to the leakage control.

As Java technologies are more widely adopted in battery powered devices such as cellphones, PDAs, and pagers, optimizing the power consumption in Java environment is becoming a critical issue. Java virtual machine (JVM) relies on the garbage collector (GC) for automatic memory management. In [4], Chen et al. proposed a GC-controlled leakage energy optimization technique that shuts off memory banks that do not hold live data. Their schemes reduce the leakage energy consumed by the heap memory significantly. However, conventional GC is invoked at a fixed frequency to detect and turn off the memory banks containing no live objects. High frequent GC will unnecessarily decrease the performance of the virtual machine. On the other side, GC at very low frequency will lose the opportunities for leakage optimization. The optimal GC frequency depends on the behavior of a particular application. In [5], the authors further developed an adaptive scheme that dynamically adjusts the GC frequency according to the memory allocation behavior of the applications. This adaptive scheme provides a leakage reduction approaching that delivered by the optimal GC frequency of a given application.

In attempting to reduce leakage energy, we might increase the susceptibility to soft errors when reducing supply voltages. The work [26] provides a detailed investigation on impacts of soft errors in caches applying drowsy leakage control scheme. The results indicate that the single event upset rate (SER) increases dramatically from 2.5E-05 FIT/bit to 5E05 FIT/bit when the supply voltage is reduced from the normal voltage 1.0V to a drowsy voltage 0.3V. Hence to maintain the system reliability, more sophisticated error protection schemes that themselves will consume more energy will be required. Hence, as these reliability problems aggravate, devising techniques that will balance the tradeoffs between energy optimization and reliability will become important.

#### 5 Conclusions

Power consumption has become a major design constraint influencing the design of next generation systems. Combating the power problem requires a holistic effort spanning from circuits to software. Furthermore, there is a complex interaction and tradeoff between power, performance and reliability that need to be balanced carefully.

# Acknowledgment

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# Analysis and Optimization of Power Consumption for an ARM7-based Multimedia Handheld Device

Wonyong Sung, Hoseok Chang and Wonchul Lee

Abstract—We have developed a multimedia handheld device using an ARM7 RISC CPU, and optimized the current consumption not only by employing several software optimization techniques but also by using dynamic clock frequency scaling scheme (DFS). Although the CPU employed does not support operating voltage scaling, the controlling of the clock frequency according to the CPU load helps reducing the current consumption in the idle time and results in up to 25 % of power reduction in the system level. The CPU operating frequency is determined by profiling the multimedia program components, which include LZW (Lempel-Ziv Welch) image decompression, MP3 audio decoding, CELP based speech decoding, speech recognition and ADPCM. Especially, it is shown that the time for LZW decompression can be predicted from the original image size. The CPU load becomes almost full, between 80 to 95%, after applying the DFS.

Index Terms—ARM7, DFS, Embedded system, low-power system

#### I. INTRODUCTION

Alow-power multimedia handheld educational device for kids, Speaking Partner, is developed based on a low-cost ARM7 CPU [1]. This device can perform animation, MP3 play, and speech recognition in real-time. An ARM7TDMI based CPU from Samsung Electronics is chosen for the sake of good compiler support, low cost and convenient system integration, such as LCD and SDRAM controllers [2].

However, the ARM7 CPU only has a 32×8 hardware multiplier and does not support some of programmable DSP (Digital Signal Processor) specific features, such as hardware loop control, automatic address generation, and multiple buses [3]. Thus, it was very needed to optimize digital signal processing programs, such as MP3 decoding, LZW (Lempel-Ziv Welch) decompression and speech recognition, very aggressively by exploiting the ARM7 specific features such as large number of registers, conditional execution, 32-bit barrel shifter, and block transfer instructions. In addition, it is needed to reduce the current consumption since

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the device is operating with two AA-size batteries. Obviously, the optimization of software components is most critical for power consumption reduction as well as real-time implementation. The CPU goes to the idle state when all the jobs for each time frame are finished. However, the CPU consumes some power due to peripheral circuits even in the idle state, thus it is possible to further reduce the current consumption by lowering the CPU clock frequency and eliminating the idle time. Note that the CPU consumes about 1 mA/MHz when fully operated and drains about 30% of the full power when in the idle mode. The CPU does not support voltage control, thus the dynamic voltage scaling scheme according to the load is not employed [4][5].

The CPU clock frequency that minimizes the idle time is determined by analyzing the kinds of software components to execute in the current frame. An operating system that estimates the load and scales the clock frequency based on this estimate is developed.

Figure 1 shows the hardware architecture of the Speaking Partner. The CPU contains an ARM7TDMI core, 8 KB of unified cache memory, a graphic LCD controller, a synchronous DRAM controller, IIS interface, 8 channels of 10 bit ADC, and many general purpose input and output ports. This system equips a small size, 128 KB, of NOR type flash memory as a system ROM, which contains code needed for system initialization, SSFDC (Solid State Floppy Disk Card) read/write, USB (Universal Serial Bus) interface, and graphic libraries. Most of the programs as well as multimedia contents are all stored on the NAND flash memory or the SMC (Smart Media Card). Thus, programs and contents can be added or removed very conveniently using the USB interface or the removable smart media card. Note that the NAND type of flash memory only allows block read or write, thus this device can be considered as a solid-state hard-disk for this portable system. The system equips a small 2.9" 240×160 black and white 16-gray STN LCD with the back-light function. The LZW compression algorithm is employed after obtaining the frame difference, which is more efficient than the JPEG based compression for drawing based pictures [6][7].

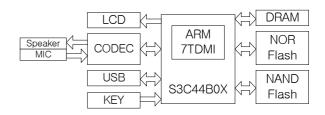


Fig. 1. System architecture.

# II. MUILTI-TASKING OPERATING SYSTEM AND DYNAMIC FREQUENCY SCALING

Since the system should conduct several multimedia functions simultaneously, a simple real-time operating system is developed. Figure 2 shows the time-assignment for 6 tasks where the audio input and output tasks are processed as top priority jobs. Note that audio jobs can cause more serious damage than graphic functions when a job for this frame is postponed to the next frame due to the shortage of CPU clock cycles.

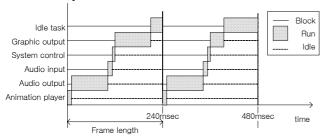


Fig. 2. The time-assignment for real-time operation.

The frame length, which can be changed by software, is normally set to 240 msec due to the low response time of the STN LCD. As shown in Fig. 2, the CPU goes to the idle state when all the jobs for the current frame are finished.

Figure 3 shows the current consumption of the CPU according to the load condition when the CPU clock frequency is 60 MHz, 30 MHz and dynamically changed. The current measured indicates all the currents needed for this system, except for speaker drive and back light, when the system is conducting LZW compression. The CPU load is controlled by changing the size and the number of images to decompress. As shown in this figure, the CPU drains some power even when the CPU load is very small although the CPU is mostly in the idle state. Thus, it is advantageous for power reduction to employ the lowest possible clock frequency. Obviously, the estimation of the minimum clock frequency for a real-time implementation is needed.

The current consumption for the CPU load of 20% is 120 mA when the clock speed is 60 MHz without any idle state transition. According to Fig. 3, 95 mA is consumed when the clock speed is 60MHz with idle state, and 72 mA when the dynamic frequency scaling is employed. This shows that the dynamic frequency scaling scheme is more efficient than the constant frequency operation with idle state when the load condition is low.

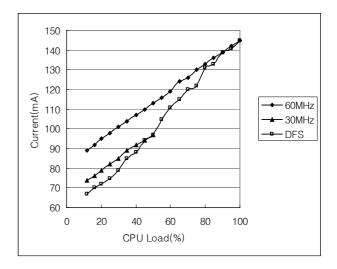


Fig. 3. Current consumption of constant frequency system with idle state and dynamic frequency system.

Table 1 shows the current consumption at each hardware block when the CPU load is 10%. As shown in this table, the current consumption in the CPU is more drastically reduced, more than 67%, although the total system current is reduced by 26%.

 $\label{eq:table 1} TABLE~1.$  Current consumption at each hardware block.

Hardware block	Current		
	Constant freq. DFS		
CPU	34 mA	11 mA (-67%)	
DRAM	29 mA	29 mA	
LCD display	15 mA	15 mA	
Others	11 mA	11 mA	
Total	89 mA	66 mA (-26%)	

## III. SOFTWARE OPTIMIZATION TECHNIQUES

The ARM7TDMI processor has a relatively simple data path, where the hardware multiplier only has the accuracy of 32×8 bits. This may mean that the CPU is not good for executing multiplication intensive digital signal processing programs. However, the CPU has a few advantageous characteristics for implementing DSP algorithms [8][9]. Firstly, it has a fairy large number of registers, 31 for general purpose, when compared with traditional programmable digital signal processors. Thus, it helps much for reducing the memory accesses and shows a quite good compiler performance. Secondly, most of the instructions can be executed conditionally. It significantly reduces the control overhead in control intensive routines like the Huffman decoder. Thirdly, it has a 32-bit barrel shifter that can simultaneously execute shift and rotation with ALU operations. This feature is useful for scaling and multiplication by 2 constant. Fourthly, block load and store (LDM, STM) instructions are supported, which move 16 registers from or to memory using a single instruction. Note that the block load and store instructions are not normally found at the inside of functions in the compiler generated codes, thus it needs some manual assembly coding to utilize these instructions.

Figure 4 shows the implementation results, in terms of the

needed number of instructions and cycles, for the implementation of the IMDCT (Inverse Modified Discrete Cosine Transform) function which is needed for MP3 playback [10]. Three implementations are compared in this figure. The implementation 'A' corresponds to the one that employs 32×32 bit multiplications with no block move, the implementation 'B' is the one that employs 32×32 bit multiplications with block move, and the implementation 'C' is based on 32×16 bit multiplications with block move. The implementation results show that the improvement due to efficient data move, block moves, is much larger than the reduction of precision in the multiply [11].

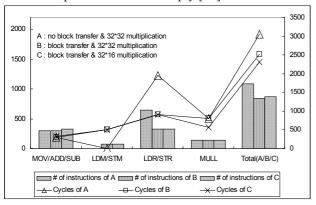


Fig. 4. Number of instructions and cycles in IMDCT function.

#### IV. CPU LOAD ESTIMATION

The CPU load for executing each software components which include image decompression, MP3 playback, CELP based speech decoding, and speech recognition is needed for determining the optimum clock frequency. The profiling results show that the load for MP3 decoding is dependent on the bit rate and sampling clock frequency. The CPU load with 60 MHz clock is 10 % for 56kbps 22.05 kHz, 9.6% for 32 kbps 22.05 kHz and 7% for 32 kbps 16 kHz. The time for CELP decoding is almost constant and is 18% of the 60MHz CPU load. However, the CPU load for LZW is very much varying in each frame.

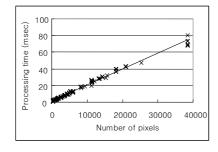


Fig. 5-(a). Processing time of LZW according to the number of pixels.

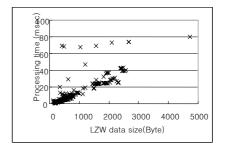


Fig. 5-(b). Processing time of LZW according to the compressed data size.

The decompression time for LZW image is shown in Fig. 5-(a) and -(b). This figure clearly shows that the LZW decompression time is proportional to the image size, not the compressed data size.

Table 2 summarizes the execution time prediction of each software component. A 15 msec of overhead, which is added to LZW decompression, is needed for updating each frame of image, which corresponds to moving pixels from working memory to the display memory area. The ADPCM encoding time includes the CPU load for drawing speech waveforms on the LCD screen. The speech recognition implemented is based on a connected word recognition algorithm, and consists of speech acquisition and recognition phases. The CPU is operating at full speed until the result is obtained at the recognition phase [12].

EXECUTION TIME PREDICTION OF EACH SOFTWARE COMPONENT

S/W component	Execution time at 60MHz(ms)	
LZW decompression	$\frac{\text{number of pixel}}{800} \times 1.55 + 15$	
MP3 decoding	27.5	
G.729 decoding	42.5	
ADPCM encoding	56.3	
ADPCM decoding	2.5	
Margin	10	

#### V. EXPERIMENTAL RESULTS

Figure 6 shows the CPU load of an application which displays animation while playing MP3 sound. As shown in this figure, the CPU load is about 30% at the beginning frames, becomes about 95% at the frame number 9, and about 65% after this frame. When the DFS is employed, the CPU clock frequency is changing between 20MHz and 65 MHz, and the CPU load of each frame is maintained over 80%. In this application, the average current consumption in the system level is reduced by 20%.

The system is operating using two AA-size 1.5V batteries that normally have capacity of 1500 mAh. The power supply for the system consists of 3.1 volt for most digital and analog circuits, 2.5 volt for CPU core, and 21 volt for LCD. The audio amp for the system can produce 150 mW using a 32-Ohm speaker.

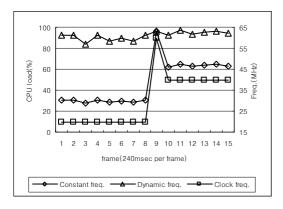


Figure 6. CPU load of constant and dynamic frequency systems.

The current consumption measured at 3.0 volt supply (battery terminals) is shown in Table 3 according to the activity of the system. Note that the power for speaker driving is included.

 $TABLE\ 3.$  Current consumption according to each activity.

Activity	CPU load	Original	Optimized
		current	current
Menu display	11 %	92 mA	68 mA
Song with animation	65 %	175 mA	160 mA
Speech recognition	100 %	150 mA	150 mA
MP3 play	10 %	125 mA	100 mA

#### VI. CONCLUDING REMARKS

A low-power handheld multimedia device is developed using an ARM7 CPU. A dynamic frequency scaling scheme is employed in order to reduce the CPU power consumption, which shows that about 20 % of system power saving can be achieved when compared to constant frequency operating scheme with idle state. The CPU clock frequency is determined by the real-time operating system, which sums up the CPU loads needed for executing all the software components. The amount of clock cycles for implementing each software component is measured by profiling. Obviously, the current can be further reduced, without any significant change in the power reduction algorithm, if we employ a CPU that supports the dynamic voltage scaling, such as Intel's Xscale [13].

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# A Cycle-Accurate Joulemeter for CMOS VLSI Circuits

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#### **Abstract**

Cycle-accurate energy measurement is very useful in reducing the energy consumption in the CMOS VLSI circuits, which was reported in [1]. This paper introduces a simple energy measure system, describes three energy models for the CMOS circuits, and derives their energy equations for a clock edge. Then, we compare their accuracy with the simulation and experiment results for a simple inverter. We found that instead of representing all load capacitance as a capacitor to ground, we should separate the capacitance to ground and that to supply for accurate energy analysis in implementing an accurate joulemeter.

#### 1. INTRODUCTION

There have been several methods to estimate the percycle energy or power consumed in a CMOS VLSI circuit [2], [3]. Simulator-based energy estimation methods are simple and popular. Low-level energy estimators are accurate but slow for a complex circuit. On the other hand high-level simulators are fast but inaccurate.

We can measure the energy consumed in a CMOS VLSI circuit by integrating the instantaneous current value when the supply voltage is constant. However, what we can measure with an ammeter is not the instantaneous current but its time-average. To overcome this limitation, measurement using capacitors and switches was recently proposed by Chang [1].

The contents of the lecture are as follows:

#### □ Introduction

#### □ Energy Estimation in Measurement System

- · Energy model 1
- Energy model 2
- · Energy model 3
- Energy model 4

#### □ Second Order Effects

- Leakage current
- · Overlapping current
- Nonlinear capacitance
- □ Experimental Results
  - Altera FPGA
  - ARM7TDMI

## 2. ENERGY MEASUREMENT SYSTEM

The methods using external capacitors and switches can integrate high frequency components inherently, as shown in Fig. 1. First, the capacitor  $C_M$  is charged to a certain reset level before arriving a clock edge. Although the current is spiky when the energy is consumed in the chip, we can

calculate the consumed energy by measuring the voltage drop of  $V_{\text{M}}$ . The energy transferred into the chip can be written as follows,

$$E = \frac{1}{2} C_M V_1^2 - \frac{1}{2} C_M V_2^2$$

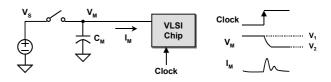


Fig. 1. Energy measurement using a capacitor and a switch.

The energy E is consumed or stored in the chip under measurement. A typical block diagram of the energy measurement system using a capacitor and two switches is shown in Fig. 2.

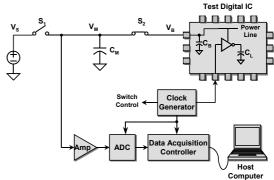


Fig. 2. Cycle-accurate energy measurement system using a capacitor and two switches

First, switch S<sub>1</sub> is closed before arriving a clock edge, which charges capacitor  $C_M$  to the supply voltage level  $V_S$ . Switch S<sub>2</sub> is open during charging capacitor C<sub>M</sub>, which separates the chip from the supply. Note that capacitor C<sub>B</sub> models the total capacitance connected to the internal power line, including the on-chip decoupling capacitance, which varies after every clock edge. Note that switch  $S_2$  is used to determine the value of capacitor C<sub>B</sub>. Capacitor C<sub>L</sub> represents the internal load capacitance, which also varies after every clock edge. An amplifier is employed to amplify the voltage drop of V<sub>M</sub> to meet the ADC input range of 1 or 2 volts. The voltage drop of V<sub>M</sub> should be limited not to disturb the proper operation of the chip. Consequently, the voltage drop of V<sub>M</sub> must be within 100~200mV, which can be controlled by adjusting the size of the capacitor C<sub>M</sub>. The digital data from the ADC is stored in real time in memory. Later, the host computer calculates the consumed energy using the ADC data.

Fig. 3 shows the timing diagram of the control signals in the measurement system in Fig. 2. When  $S_1$  is closed,  $V_M$  is

charged as  $V_S$ . When  $S_2$  is closed, charge sharing between  $C_M$  and  $C_B$  occurs, which induces a small voltage drop of  $V_M$ . Then, when a clock edge arrives, the chip draws a relatively large current, which makes another voltage drop of  $V_M$ . Three sampling points for a clock edge are necessary for estimating the consumed energy. Therefore, the clock frequency should be lowered to ensure enough settling time for both recharging and sampling  $V_M$  for each clock edge.

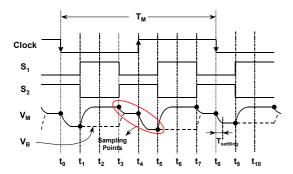


Fig. 3. Timing diagram of cycle-accurate energy measurement system.

#### 3. ENERGY CALCULATION MODELS

Per-edge energy measurements will require proper modeling and analysis of its internal circuit. A per-cycle energy measurement can be obtained by adding two consecutive per-edge energy measurements. In this paper we describe three models and derive an expression of how to calculate the energy consumed for a clock edge for each model.

#### A. Model 1: Energy consumed in the chip under measurement

It calculates the energy transferred from the capacitors  $C_M$  and  $C_B$  into the load capacitor  $C_L$ . If the sampled values of  $V_M$  before and after a clock edge are represented as  $V_1$  and  $V_2$ , respectively, then we can calculate the consumed energy,

$$E_1 = \frac{1}{2} (C_M + C_B) (V_1^2 - V_2^2)$$

assuming that the capacitors  $C_{\rm M}$  and  $C_{\rm B}$  are constant. However,  $C_{\rm B}$  can change for every clock edge.

To calculate the consumed energy for the rising edge at  $t=t_4$ , first capacitor  $C_M$  is charged to the reset level  $V_S$  after  $S_1$  is closed at  $t=t_1$ . Then, when  $S_2$  is closed at  $t=t_3$ , charge sharing occurs between  $C_M$  and  $C_B$ . From the charge conservation law (CCL),

$$C_M V_M(t_3) + C_B(t_3) V_B(t_3) = (C_M + C_B(t_4)) V_M(t_4)$$

Assuming that no leakage current exist in the device under measurement, it is clear that  $V_B(t_3)=V_B(t_1)=V_M(t_1)$ . Furthermore,  $C_B(t_3)=C_B(t_4)$  because  $C_B$  does not change before arriving a clock edge. Therefore,

$$C_M V_M(t_3) + C_B(t_4) V_M(t_1) = (C_M + C_B(t_4)) V_M(t_4)$$

Because  $C_M$  is a known constant, capacitor  $C_B$  can be written as

$$C_B(t_4) = \frac{V_M(t_3) - V_M(t_4)}{V_M(t_4) - V_M(t_1)} C_M$$

Similarly,

$$C_B(t_5) = \frac{V_M(t_7) - V_M(t_8)}{V_M(t_8) - V_M(t_5)} C_M$$

Consequently, the consumed energy after a clock edge at t=t<sub>3</sub> can be written as

$$E_{1} = \frac{1}{2} \left( C_{M} + C_{B}(t_{4}) \right) V_{M}^{2}(t_{4}) - \frac{1}{2} \left( C_{M} + C_{B}(t_{5}) \right) V_{M}^{2}(t_{5})$$

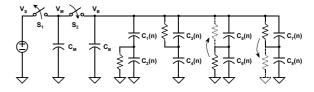
Note that because it includes the measurement distortion due to the measurement setup, it does not equal to the energy consumed in the chip that is in the real operation setup.

#### B. Model 2: Energy transferred to the chip

Model 2 calculates the energy transferred into the load capacitor after a clock edge, which does not equal to the energy consumed after the edge. In this model, we first calculate the load capacitance  $C_L$  per clock edge, which does not include any distortion due to the measurement setup, assuming that the load capacitance  $C_L$  does not depend on the voltage. Then, we can calculate the energy transferred after the edge as follows,

$$E_2 = C_L V_{DD}^{2} \tag{1}$$

 $V_{DD}$  in Eq. (1) does not mean the  $V_{S}$  in the measurement setup but the supply voltage used in the real application setup. A half of the transferred energy is consumed as a heat in the MOS transistors and the rest of it is stored in many load capacitors in a complex CMOS VLSI circuit. However, the stored energy of 50% is consumed partially when the logic state of an output, where the energy is stored in its load capacitance, is changed.



Group	Symbol	Description
1	C <sub>1</sub> (n) / C <sub>2</sub> (n)	Stay in the low state
2	C <sub>3</sub> (n) / C <sub>4</sub> (n)	Stay in the high state
3	C <sub>5</sub> (n) / C <sub>6</sub> (n)	Switch from low to high
4	C <sub>7</sub> (n) / C <sub>8</sub> (n)	Switch from high to low

Fig. 4. Circuit modeling and four cases according to the output transition at the nth clock edge.

To find  $C_L$ , we first calculate  $C_B$ , which is the same with  $C_B$  in model 1. After that, we can write CCL for the rising edge at  $t=t_4$ ,

$$(C_M + C_B(t_4))V_M(t_4) = (C_M + C_B(t_5) + C_L(t_5))V_M(t_5)$$

Then,  $C_L(t_5)$  can be written as

$$C_{L}(t_{5}) = \frac{\left(C_{M} + C_{B}(t_{4})\right)V_{M}(t_{4}) - \left(C_{M} + C_{B}(t_{5})\right)V_{M}(t_{5})}{V_{M}(t_{5})}$$
(2)

With Eq. (1) and Eq. (2), we can calculate the energy transferred to the chip after a clock edge

#### C. Model 3: Energy consumed in the chip

In model 2 all load capacitance is represented as a capacitor to ground, which is ok only for timing analysis. However, for exact energy analysis, we should model the load capacitance with both capacitors to ground and capacitors to supply in a CMOS VLSI circuit. Logic states can be changed after arriving a clock edge as shown in Fig. 4. There are four cases for the state transitions of the load capacitance, where n denotes to the transition for the n-th clock edge.

Using the fact that the capacitors in groups 1 and 2 in Fig. 4 are equivalent to the internal bypass capacitor  $C_B$ , the circuit in Fig. 4 can be simplified to the circuit shown in shown in Fig. 5. Then, the energy consumed for the n-th edge can be written as follows,

$$E_3 = \frac{1}{2} \left( C_5(n) + C_6(n) + C_7(n) + C_8(n) \right) \cdot V_{DD}^2$$

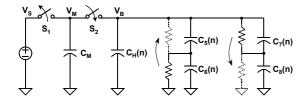


Fig. 5. Simplified circuit modeling for the load capacitance.

The timing diagram for the energy measurement system is redrawn in Fig. 6. When  $S_2$  is closed before arriving the n-th edge, we can employ the CCL as follows,

$$C_M V_1(n) + C_{H58}(n) V_3(n-1) = (C_M + C_{H58}(n)) V_2(n)$$

where  $C_{H58}(n)=C_H(n)+C_5(n)+C_8(n)$ .

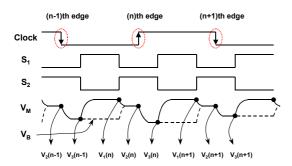


Fig. 6. Timing diagram for the energy measurement system.

Then

$$C_{H58}(n) = \frac{V_1(n) - V_2(n)}{V_2(n) - V_3(n-1)} C_M$$
 (3)

From the CLL after the n-th edge

$$(C_M + C_H(n))V_2(n) = (C_M + C_{H67}(n))V_3(n)$$

where  $C_{H58}(n)=C_H(n)+C_5(n)+C_8(n)$ . Then,

$$C_{H}(n) = \frac{\left(C_{M} + C_{H67}(n)\right)V_{3}(n)}{V_{2}(n)} - C_{M}$$
 (4)

Here,  $C_{H67}(n)$  can be obtained from the measurements for the (n+1)-th edge. When  $S_2$  is closed prior to the (n+1)-th

edge, by employing the CCL,

$$C_M V_1(n+1) + C_{H67}(n) V_3(n) = (C_M + C_{H67}(n)) V_2(n+1)$$

Note that  $C_{H67}(n)=C_{H58}(n+1)$ . Therefore,

$$C_{H67}(n) = \frac{V_1(n+1) - V_2(n+1)}{V_2(n+1) - V_3(n)} C_M$$
 (5)

From Eqs. (3), (4), and (5),

$$C_{5678}(n) = C_{H58}(n) + C_{H67}(n) - 2C_H(n)$$

where  $C_{5678}(n) = C_5(n) + C_6(n) + C_7(n) + C_8(n)$ . Consequently, the energy consumed after then n-th edge can be written as

$$E_3(n) = \frac{1}{2} C_{5678}(n) \cdot V_{DD}^2$$

This energy is dissipated as the heat because of the transitions corresponding to the n-th clock edge. From model 3, we can also obtain the energy transferred to the chip at the n-th clock edge, which equals to

$$E_4(n) = C_{67}(n) \cdot V_{DD}^{2}$$

For more analysis on the three models, we swept  $V_S$  and  $C_M$ . We calculated the  $C_L$  and energy based on the equations derived in the previous section. And the errors in each model to the reference circuit in Fig. 7 are summarized in Table I and II. The error in model 1 is very sensitive to both  $V_S$  and  $C_M$  in the measurement system. Although the error is not sensitive to  $V_S$  in model 2, it gets larger as  $C_M$  decreases.

However, the error in model 3 is not sensitive to both  $V_S$  and  $C_M$  and it is rather small, which is less than 1%. Among the three models, only model 3 is suitable for exact energy measurement. The error of  $C_L$  in model 3 seems to be due to its simplified modeling, which does not include all the parasitic capacitors. Note that the error of energy in model 3 is larger than that of  $C_L$  because the energy equation in model 3 is also simplified, which does not include, for example, the effect of the overlapping current of the inverter.

#### 4. EXPERIMENTAL RESULTS

We implemented the cycle-accurate energy measurement system on a printed circuit board with discrete components as shown in Fig. 7. First, we tested it with a simple inverter with large load capacitance. Two load capacitors used in this experiment are 430pF respectively: one is connected to ground and the other is to supply line. And the clock frequency we used is 625kHz, which is slow enough to satisfy the settling time constraints.

From the measured data, we calculated the load capacitance and the consumed energy for the three models. Experimental results are summarized in Table III. Just like the simulation results, the error in model 3 was much smaller than those in the other models. Note that the error of energy in Table III is the same with that of  $C_L$  because we use the energy calculated from  $C_L V_{DD}^2$  as a reference.

TABLE I EXPERIMENTAL RESULT: % Error vs.  $C_{M}$ .

	% error					
$C_{\rm M}$	Model 1		Model 2		Mod	del 3
[nF]	$C_{ m L}$	Energy	$C_{\mathrm{L}}$	Energy	$C_{\mathrm{L}}$	Energy
3.9	-	-10.0	8.2	8.2	-1.5	-1.5
5.3	-	-6.1	7.7	7.7	0.2	0.2
6.8	-	-5.3	5.4	5.4	-0.5	-0.5
8.2		-4.5	4.9	4.9	-0.3	-0.3
10	-	-3.8	3.5	3.5	-0.5	-0.5
2.2.	_	-2.6	1 4	1 4	-0.5	-0.5

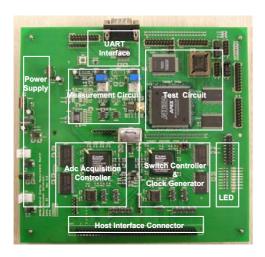


Fig. 7. A prototype PCB for cycle-accurate energy measurement

#### 5. CONCLUSION

Cycle-accurate energy measurement is useful for energy optimization in both the embedded software development and low-power SOC design. For energy measurement, correct circuit modeling and analysis are essential. Therefore, in this paper we described three energy models that can be used for cycle-accurate energy measurement systems and derived their energy equations for a clock edge.

After comparing their errors through the simulations and experiments for an inverter, we found that simple load capacitance model to ground is not good enough for energy analysis. Instead, we should separate the capacitance to ground and that to supply for accurate energy analysis in implementing an accurate joulemeter. We also concluded that model 3, which is the most accurate, is suitable for cycle-accurate energy measurement systems.

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# **Event-Driven Energy Characterization**

#### Frank Bellosa

Abstract—Embedded hardware monitors in the form of event counters have proven to offer valuable information in the field of performance analysis. We will demonstrate that counter values can also reveal the power-specific characteristics of a thread. A recurrent analysis of the thread-specific energy and performance profile allows the operating system an adjustment of the power consumption to the behavioral changes of the application. The adjustment can be done with respect to the demands of individual applications, users or services.

The lecture gives two examples for OS-directed power management on the level of threads:

An energy-aware scheduling policy for non-real-time operating systems is proposed which benefits from event counters. By exploiting the information from these counters, the scheduler determines the appropriate clock frequency for each individual thread according to the performance requirements. This adaptive clock scaling is accomplished by the operating system without any application support. Energy measurements of a low-power architecture under variable load show the advantage of the proposed approach.

Another use case for event-driven energy characterization is dynamic thermal management. The lecture describes a model to determine the energy consumption of individual threads and to estimate the temperature of a high-power processor without the need for measurement.

This power and thermal model is combined with the well-known facility of resource containers to throttle the execution of individual tasks according to their energy-specific characteristics and the thermal requirements of the system.

Experiments show that a given temperature limit for the CPU will not be exceeded while tasks are scheduled according to their attached resource containers.

Index Terms — Operating Systems, scheduling, power management, frequency scaling, thermal management

#### I. INTRODUCTION

To meet the insatiable demand for high performance hardware, components with increased gate count and clock frequency were developed. The improvements in manufacturing processes could not keep the power increase at a reasonable level. With the emergence of portable devices and the thermal problems of high power processors we are suddenly facing a rising awareness for the topic of energy management.

This lecture contributes to this awareness and presents a new approach in system software: the on-line evaluation of counters that register performance- and energy-critical events. We will show that there is not only a correlation between events and performance but also between events and power consumption. By exploiting these counters the operating system has the complete knowledge

- where the energy has been consumed,
- where the time has been spent, and
- who has been responsible for the use of energy.

According to the individual demands of each application, power management can find a trade-off between energy consumption, energy efficiency and quality of service demands. To fulfill this task an operating system has a variety of options for the activation and configuration of energy-critical hardware components. Not only the time of activation but also the degree of activation (e.g., the clock speed of a processor) can be controlled.

The next sections describe the benefit of event driven energy characterization for improving the energy efficiency of processors with variable clock speed and for dynamic thermal management of high performance processors.

#### II. PROCESS CRUISE CONTROL

Performance and energy consumption at variable speeds are two characteristics which are correlated, but the degree of correlation depends on the use of performance- and energy-critical hardware components. Only if the operating system knows the specific usage patterns of each of the managed execution entities (threads or processes), it can find the best energy/performance trade-off and select the right speed of execution [4].

# A. The Policy Model

Our approach to find the patterns is the on-line evaluation of event-counters [8]. For a specific architecture we have to find a set of countable events that characterize the behaviour of a thread concerning performance and energy consumption when the thread is executed at various clock frequencies. The rates at which these events can happen at a certain clock frequency span a multidimensional space which describes all the potential patterns a thread could exhibit.

For each point in the space we can find the proper clock frequency that minimizes the energy consumption for a given performance requirement.

We are facing the challenge to partition this space into domains with equal clock frequency and to describe these partitions (frequency domains) in a way that the scheduler of the operating system can determine the clock speed of a specific thread by a fast mapping from event rates to clock frequencies. The optimal speeds for the various event rates and, consequently, the resulting partitions depend on the restriction in performance loss. The current set of partitions defines the *model policy*.

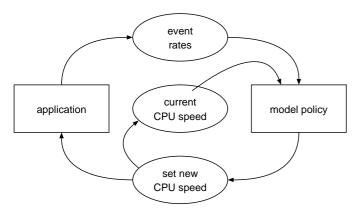


Figure 1: Process Cruise Control loop

A scheduler implementing Process Cruise Control adapts the clock speed when switching from one thread to another. The new frequency is determined by a periodic evaluation of the event rates in the latest history of the thread. Therefore the scheduler has to find the frequency domain that matches all the event rates of the thread. We saw that while the energy specific characteristics of a single thread change only slowly over time, the characteristics of concurrently running threads alter frequently and show a wide variation. For a single thread it is sufficient to analyze the behaviour of this thread at each context switch. Our approach respects the variation in behaviour by adapting the clock speed at each thread switch according to the characteristics of this thread. This guarantees an optimal speed adaptation.

The data flow in figure 1 shows the relation of the Process Cruise Control model to a car cruise control or any other controlled system. Sampled event rates along with corresponding execution speeds run into the model policy.

An optimal speed prognosis is made and applied to the application. Again, the new CPU speed is fed into the model along with newly measured event rates closing the loop of control.

To summarize, our approach can be outlined as follows:

- Determine the correlation between the rates of different events and both performance and energy consumption.
- Identify the lowest possible clock frequency (the *optimal speed*) for a certain combination of event rates under an user-specified upper bound for performance degradation.
- On each task-switch, scale the clock frequency according to the pre-computed optimal speed for the thread specific event rates.

### B. XScale Frequency Domains

The Intel XScale 80200 processor used in an Intel IQ80310 evaluation board implements one clock and two event counters. Under these restrictions, the selection of the following events is recommended:

- The memory requests per clock cycle clearly indicate the degree of memory use. The higher the rate of memory requests the more the energy performance will benefit from a reduction in clock speed as the processor does not waste energy for memory stall cycles.
- The instructions per clock cycle indicate the sensitivity for a performance loss due to speed reduction. The lower the rate of executed instructions is the less the performance of a thread will suffer from a reduction in clock speed.

Cache misses as an indicator for energy consumption can not be used because several event counters for all types of energy-relevant cache events are not available on the target architecture. Furthermore several counters for different cache events would have to be monitored in parallel. Therefore we used the counter for memory requests because they showed the best correlation to energy consumption.

To span the space of both event rates we constructed micro benchmarks producing various event rates. For each clock speed, we determined the event rates for each of these benchmarks. The next step is to find the minimal clock speed which can be tolerated for given performance requirements. For our tests we chose 10% as an acceptable performance loss. The last step is to partition the two-dimensional space into frequency domains.

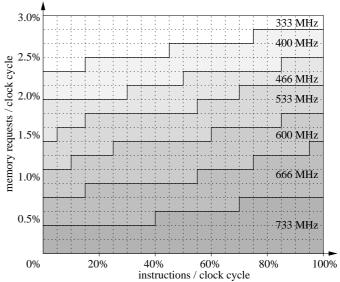


Figure 2: XScale frequency domains for Intel IQ80310

We chose a simple approach with matrices that define the frequency domains (for an example see figure 2). The dimensions of the matrix are the event rates, the percentage of instructions per cycle, ranging from 0% to 100%, and the percentage of memory requests per cycle, ranging from 0% to 3% (this is the maximum value achievable by artificial micro benchmarks). A simple matrix look-up operation yields the optimal clock speed.

#### C. Measurements

To show the benefits of event-driven clock scaling we measured the energy consumption and performance of five well known applications to find the optimal clock speed according to external energy measurements and to compare the optimal frequency with the results of process cruise control. We ran these five applications at all possible clock frequencies to determine the energy consumption, performance and clock speed according to an allowed penalty of 10% performance loss.

application	optimal speed	process cruise control:	
		clock scaling	energy savings
find   grep	400 MHz	400 MHz	15 %
gzip	466 MHz	466 MHz	10 %
djpeg	600 MHz	533 MHz	8 %
factor	600 MHz	600 MHz	4 %
ghostscript		400MHz – 600 MHz	5 %

We could prove that it is possible to come very close to the optimal clock frequency by an on-line evaluation of event counters. For three applications process cruise control determined the optimal clock speed. One application (djpeg) is scheduled with a speed that is just one step to low. The runtime behavior of the postscript interpreter is influenced by the content of the postscript file to convert. Therefore the frequency switching pattern of the process run depends on the content and structure of the input file and varies between 400 MHz and 600 MHz.

For the Intel IQ80310 system energy savings of 15% are possible without severe performance impact. If we tolerated a higher performance degradation, the energy efficiency could be improved further.

#### D. Limitations

The selection of countable events was done to support performance profiling and not energy profiling. Several events which differ substantially in their energy consumption cannot be differentiated. An example are read and write memory requests which differ in their energy characteristics.

The qualitative characterization of Cruise Control using just two counters was sufficient for best-effort optimization of the energy consumption, however it is inadequate for quantitative guarantees which require the sampling of many more energy-critical events.

#### III. DYNAMIC THERMAL MANAGEMENT

Control-theoretic techniques have proven to manage the heat dissipation and temperature starting from the level of functional blocks within the processor up to the level of complete systems, so that a thermal emergency will never be reached [7]. However application-, user- or service-specific requirements had to be neglected. The reason is not so much a lack of fast acting thermal response mechanisms but missing on-line information about the originator of a specific hardware activation and the amount of energy consumed by that activity.

In this lecture, we present an event-driven energy-estimation model that employs event-monitoring counters to determine on-the-fly the actual power consumption and who has used the power in the system. With the specification of the cooling system (thermal resistance and capacitance), the temperature can be estimated without the need for measurement and used to trigger task-specific throttling. The event-driven power and thermal model is combined with the facility of resource containers [1] to throttle the execution of individual tasks according to their energy-specific characteristics, their service requirements and the thermal

demands of the system. We call this operating system abstraction *Energy Containers*. Additionally we present a CPU scheduler which identifies and penalizes "hot" processes by reducing their time slices.

Two target application spaces benefit from dynamic thermal management: in the server market, cooling facilities play a significant role in the overall power consumption and costs. Furthermore, cooling facilities are often overprovisioned in order to cope with a cooling unit failure. In the laptop market, dynamic thermal management could make fans obsolete or at least limit the power consumption used for cooling and, as a consequence, achieve longer battery lifetime.

#### A. Event-Driven Energy Estimation

The increasing complexity of modern processors (superscalar architecture, out of order execution, branch prediction, ...) demands a more elaborate procedure to estimate on-the-fly the power consumption. While it was sufficient for former architectures like Pentium II to calculate the percentage of CPU activity [6], we registered a wide variation of the active power consumption between 30 W and 51 W for the P4 architecture running a compute intensive task. We measured the power and energy consumption of a set of test programs structured in three groups (see bars in figure 3):

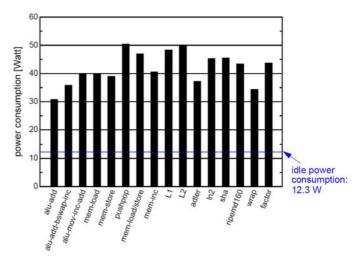


Figure 3: Measured and estimated power consumption

- ALU: programs which operate entirely on registers using ALU instructions like addc, bswap, xor, ...
- MEM: programs which operate on registers and memory (including L1/L2 caches)
- Micro benchmarks which perform various algorithms (checksum, factor, heron, SHA-1, RIPEMD-160, ...).

Because there are high-power tasks that need about 70% more power than low-power tasks, CPU cycles are no longer a clear indicator for energy consumption.

The next step is to use more processor-internal information provided by the performance counters on-line. Modern processors feature much more performance counters than their predecessors. In particular, the Pentium 4 architecture provides 18 performance counters which can be used simultaneously.

Our approach to energy estimation is to correlate a processor-internal event to an amount of energy. As events

being monitored correspond to specific activities, this correlation has linear characteristics. Therefore, we select several events which can be counted simultaneously and use a linear combination of these event counts to estimate the processor's energy consumption.

The event selection was done manually. For each set of events, test programs were run and their consumption recorded. The data gained from such a test consists of:

- Energy consumption for m processes:  $\overline{e}^T = (e_1, e_2, K, e_m)$
- *n* performance counter values for each of the *m* processes:  $A = \begin{bmatrix} a_{i,j} \end{bmatrix} (1 \le i \le m, 1 \le j \le n)$

The problem is to find a vector  $\overline{\mathbf{x}}^{\mathrm{T}} = (\mathbf{x}_1, \mathbf{x}_2, \mathbf{K}, \mathbf{x}_n)$  with  $\|\mathbf{A} \cdot \overline{\mathbf{x}} - \overline{\mathbf{e}}\|_2$  minimal and  $\mathbf{A} \cdot \overline{\mathbf{x}} - \overline{\mathbf{e}} \mid \mathbf{\acute{Y}}\mathbf{0}$  so that an under-estimation of the energy will not be accepted.

The following table shows the final set of events, their weights (energy consumption), the maximum event rate, and the maximum power contribution of a specific event. We found quite promising correlations between energy consumption and integer ALU operations, load-/store operations and cache-references.

event	weight [nJ]	maximum rate (events per cycle)	power contribution @2GHz[Watt]
time stamp counter	6.17	1.0000	12.33
unhalted cycles	7.12	1.0000	14.24
uop queue write	4.75	2.8430	26.99
retired branches	0.56	0.4738	0.53
mispred branches	340.46	0.0024	1.62
mem retired	1.73	1.1083	3.84
ld miss1L retired	13.55	0.2548	6.91

For complex floating point instructions, MMX, SSE, and SSE2 operations our quest for a set of events failed because of a lack of meaningful events. Although these internal events are known and are used in INTEL's architectural-level power simulator ALPS [5], they cannot be counted with the performance monitoring infrastructure of the Pentium 4. Therefore we focused on integer applications to demonstrate the viability of our approach. A further restriction is the fact that first- and second-level cache misses cannot be counted simultaneously, although both are highly relevant events for energy estimation. Most applications show a low 2nd-level cache miss rate, so we decided to ignore the power contribution of 2nd-level cache misses. For some memory intensive applications this can lead to an underestimation of energy consumption of up to 20%.

# B. Energy Containers

To manage energy as a first class resource [9] we apply the abstraction of resource containers. In contrast to accounting to processes or threads, this mechanism considers resource consumption on kernel-level as well as resources used by server processes working on behalf of clients. *Energy Containers* are a specialized form of resource containers that can account energy accurately and with respect to client-server relations. When a machine is running under energy pressure, processes are throttled according to the limits of the energy containers. Energy accounted to an energy container is also accounted to its parent container.

Hence, the root container indicates the total energy consumption of the system.

The operating system stops all activities that do not have enough energy in their energy container and enters low-power states to reduce power dissipation. By putting the CPU into a low-power state (e.g., HLT-state) for a short duration of time, it is possible to modulate the processor power consumption. Further potential throttling mechanisms are discussed in [3].

The energy containers form a hierarchical structure, so that one container affects all containers of the sub-tree. The top-level resource container controls any energy consuming activity in the complete system. By changing the amount of energy in this container, system-wide power consumption can be managed according to thermal requirements.

# C. From Energy to Temperature

With the processor's energy input known, we are able to estimate the processor temperature by looking at the thermal characteristics of the heat sink. The heat sink's energy input consists only of the energy consumed by the processor. The energy output of the heat sink is primarily due to convection (see figure 4). For details of the thermal model see [2].

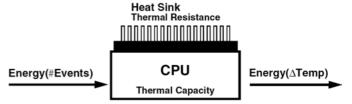


Figure 4: Thermal model

Energy output by heat radiation was not considered because the temperature is quit low ( $< 70^{\circ}$  Celsius) and the aluminium surface has a low radiation emitting factor. In addition to that, leakage power influences the total power consumption. Though this effect is temperature dependent, it shows only little variation for the temperature ranges of our experiments ( $30^{\circ}$ – $60^{\circ}$  celsius) and is therefore treated as constant.

Our approach to temperature control is to compute an energy limit for each time-slice for the whole computer (= root container), based on the current estimated temperature and the temperature limit. By limiting the root container's power consumption, the change in the processor's temperature will never result in an overrun of the critical temperature.

Small errors in the temperature estimation mechanism or errors due to changing ambient temperature will accumulate over time. We measured an error of 3°–5° C over a period of 24 hours. In order to prevent such deviations the estimated temperature is periodically adjusted to the measured temperature. For this re-calibration a period of 10 to 20 minutes is sufficient.

In order to examine the effects of energy- or temperature-aware process scheduling, we modified the allotment strategy for CPU time of the Linux scheduler. We implemented a scheduler which computes time slices according to the relative power consumption of the process compared to the power consumption of the root container. This relation reflects the contribution of the process to the current power dissipation and, furthermore, to the current temperature level of the CPU. Additionally, the priority computation—the decision which process will run next—is based on the relative power consumption. With this approach "hot" processes are disadvantaged by the scheduler.

To sum up, we are able to identify hot processes using energy containers. We present two means to deal with them: first, limiting the power consumption of the attached containers automatically throttles hot processes as they spend their power budget faster than the others. Second, a power-based process scheduler can allot longer time slices to energy-efficient processes. While the second approach does not waste CPU time, throttling is needed to facilitate thermal management.

#### D. Evaluation

The effect of throttling can be illustrated with a web server accepting requests from two different classes of clients. When a critical temperature limit of 50° Celsius is reached, client #1 should be preferred and should get a share of 80% of the allowed total power, while client #2 is just allowed to consume 20% of the remaining power. Figure 5 shows the power consumption of the free running apache tasks working on behalf of the two classes of clients before and after reaching the predefined limit of 50° Celsius. The root container reflects the sum of both client containers plus the power consumption of the halted CPU accounted to the idle thread.

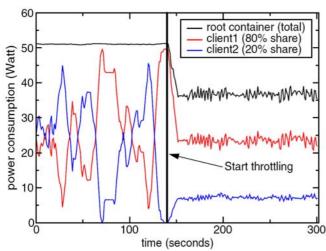


Figure 5: Throttling at 50° according to energy shares

Reading of the event-monitoring counters in a Linux 2.5 is done in the timer interrupt (1000 times per second) or when a task is blocking. The context switching times with energy container support is increased by 49% ( $5.9\,\mu s$ ) due to algorithmic overhead and the time for reading the event counters. However for a typical scenario like kernel compiling we registered an overall performance loss of less than 1% (the time a kernel compile run needs on the original kernel compared to our modified kernel).

Estimating the temperature takes about 5 µs while setting new limits to the root container requires 12. The overhead for temperature estimation can be neglected because this procedure is typically executed 1-10 times per second. Furthermore, the overhead is by orders of magnitude smaller compared to reading the temperature sensors of the motherboard (which takes about 5.5 ms).

#### E. Conclusion

Event-monitoring counters are the adequate source of information for on-the-fly energy characterization. Restricting our validation to integer applications we could demonstrate the benefit of performance monitoring counters for finding the appropriate clock frequency, for an estimation of energy consumption, and for managing the processor temperature. We expect thread-specific throttling and speed settings in combination with event-driven energy profiling to become an essential element of future operating systems for power-sensitive devices.

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# Operating System Design for Energy Management

Carla Schlatter Ellis, Alvin R. Lebeck, Xiaobo Fan, Angela Dalton, and Heng Zeng

Abstract—Energy is an increasingly important system resource in battery-powered mobile computing platforms. The Milly Watt Project at Duke University advocates managing energy as a first-class operating system resource. Our initial focus has been on the operating system design without mandating that applications must become energy-aware in order to benefit. In our ECOSystem framework, energy use is represented by the Currentcy Model. This abstraction provides a powerful mechanism to formulate energy goals and to unify resource management policies across competing applications and multiple device components with very different power characteristics. The ECOSystem prototype demonstrates how the processor, disk, and wireless network interface of a laptop computer can be managed together to achieve a target battery lifetime. Although not yet incorporated into the ECOSystem framework, we also consider techniques for managing other important system devices, namely main memory and the display.

Index Terms—operating systems, battery lifetime, mobile computing devices, energy management.

# I. INTRODUCTION

ENERGY is an increasingly important system resource in battery-powered mobile computing platforms, from laptops to tiny embedded sensor nodes. The Milly Watt Project has advocated that energy be explicitly treated as a first-class operating system managed resource [1]. Energy has a system-wide impact on the computing platform and the operating system is traditionally responsible for the system-wide management of resource supply and demand. Our challenge has been to explore what the OS can do to unify the management of a diverse set of resources under an umbrella of energy, achieve specified energy-related goals, and not require all applications to become energy-aware in order to derive benefits. Related work on application adaptation (e.g., [2]) is valuable and complementary to our approach. There has been considerable work on managing the energy use of individual devices, for example, CPU voltage scaling, disk spindown policies, and energy-aware networking. Our work is distinguished by its system-wide treatment of energy as a first-class resource.

In this short paper, we describe our ECOSystem design

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that elevates energy to a central place in the resource management of the system [3, 4]. We describe the Currentcy Model<sup>1</sup> that captures the power characteristics of device components and provides an energy abstraction for allocation and accounting. The ECOSystem prototype provides experimental evidence of the effectiveness of our approach. Although not yet incorporated into the ECOSystem framework, we also present techniques for managing main memory and the display.

#### II. THE ECOSYSTEM FRAMEWORK

#### A. The Currentcy Model

The key feature of our model is the use of a common unit— *currentcy*—for energy accounting and allocation across a variety of hardware components and tasks. Currentcy becomes the basis for characterizing the power requirements and gaining access to any of the managed hardware resources. It is the mechanism for establishing a particular level of power consumption and for sharing the available energy among competing tasks.

The target battery lifetime and our battery model are used to determine an appropriate level of current and this is translated into an amount of currentcy that can be made available during each epoch of time. This currentcy allocation is distributed to the competing tasks according to their specified proportional shares. Each task uses its currentcy allowance to gain access to devices. Each device has a pricing policy for deducting currentcy that reflects its current power mode and transitions. The calibrated power model embedded in the system tracks the power state transitions for each managed device and allows accurate

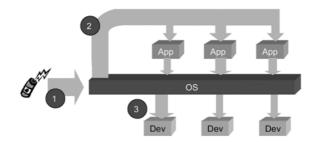


Figure 1 Currentcy Flow. Target battery lifetime determines overall currentcy allocation for an epoch (1), task shares determine per-task allocations (2), and device accounting policies deduct currentcy from task budgets (3).

<sup>&</sup>lt;sup>1</sup> Currentcy is a coined term, combining the concepts of current (i.e., amps) and currency (i.e., \$).

accounting to the tasks responsible for the device activity.

## B. ECOSystem Prototype

The ECOSystem (Energy Centric Operating System) prototype is a modified RedHat Linux version 2.4.0-test9 running on an IBM ThinkPad T20 laptop. This platform has a 655MHz PIII processor and we assume an active power consumption of 15.55W. The disk is an IBM Travelstar that we model in ECOSystem with costs of 1.65mJ per block access and 6000mJ for both spinup and spindown, and with progressive costs/timeouts for levels of idle power states. The wireless network is an Orinoco Silver PC card supporting IEEE 802.11b. It has three power modes: Doze (0.045W), Receive (0.925W) and Transmit (1.425W). All other devices contribute to the base power consumption, measured to be 13W for the platform. There is a simple user interface to set the target battery lifetime and set task shares. There is a new kernel thread kenrgd that wakes up periodically and distributes currentcy appropriately.

## C. Exploration of the Policy Space

The Currentcy Model framework and the ECOSystem prototype serve as a testbed for exploring the range of policies that can be expressed in terms of currentcy. Without some abstraction like currentcy, there is no language in which to explicitly formulate desired energy-related behaviors and solutions.

Our initial, basic policies are simply pay-as-you-go [3]. A task can gain access to a managed device as long as it has currentcy to pay for the request. Consider processor scheduling as an example: Ready-to-run tasks with currentcy remaining can be scheduled for a timeslice. When there are no tasks with any currentcy left, even though they may be otherwise runnable, the processor is halted until the next epoch's allocation. Without assuming adaptation by the application, this seems a reasonable way to throttle back service to meet the energy goal. Using feedback from a smart battery interface, the allocations can be adjusted to correct for modeling errors. I/O requests that cause disk activity result in currentcy being deducted from the responsible task with the cost of spinning up and down the disk shared by all tasks using the disk during the period between spinup and spindown.

Subsequent policies [4] have been designed to address more elaborate behaviors and solve some performance problems that arise in these simple policies. We consider four new goals: 1) reducing residual battery capacity at the end of the targeted battery lifetime when it is no longer needed, 2) dynamic tracking of the energy needs of competing applications for more effective energy sharing, 3) reducing response time variation caused by limited energy availability, and 4) energy efficient disk management. We have developed a currentcy conserving allocation policy to reclaim unspent energy by adapting to energy consumption patterns which are made observable by the currentcy abstraction. We have developed a currentcy-based scheduling policy that recognizes the global relevance of energy consumption anywhere in the system on the scheduling decision, resulting in more robust proportional sharing of energy. We further enhance that scheduling policy to pace the energy consumption, thus reducing response time variation. Finally, we demonstrate how to shape disk access patterns to amortize the energy costs of spinup/spindown across multiple requests and thereby reduce the average energy used per request. We also show the energy and performance benefits of aggressive prefetching while the disk is already spinning.

# D. Experimental Results

To investigate the impact of energy accounting inaccuracies, we use a CPU-intensive microbenchmark, but deliberately introduce an accounting error for the CPU power consumption (14W instead of the measured 15.55W). Each experiment with different target lifetimes is run until the battery is depleted. Figure 2 shows the target battery lifetime on the x-axis and the achieved battery lifetime on the y-axis. One curve demonstrates the behavior of the system without correction, in this case continuously missing the target battery lifetime by approximately 10%. Finally, another curve on the graph shows that with our periodic corrections, we are able to achieve the target despite the deliberately introduced error. We conclude that ECOSystem is successful at managing the battery lifetime.

Currentcy conserving allocation allows the system to redistribute currentcy allocations from tasks that have more than they need to tasks that can use more. The problem arises when tasks that are entitled to large currentcy allocations but

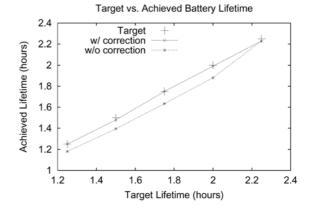


Figure 2 Achieving a target battery lifetime. With feedback from the smart battery, the achieved battery lifetime matches the target lifetime in spite of accounting errors.

are unable to consume their entire allocations (e.g., during think time) essentially throw away their unspent currentcy. To evaluate the benefits of currentcy conservation, we use a workload consisting of a gqview image viewer and ijpeg. Gqview is set to autobrowse mode where it continuously loads each of 12 images in a directory with a 10 second "think time" pause between each image. The computationally intensive ijpeg is run in a loop to continuously encode and decode an image residing in memory. The overall currentcy allocation is equivalent to 12000mW with 8000mw for gqview and 4000mW for ijpeg. With its think time, gqview can only use an average of 7000mW whereas the computationally intensive ijpeg can easily consume up to 15.5W in the processor.

Figure 3 shows the power consumption in each epoch over a 100 second time interval. This shows that when gqview is idle (i.e., during "think" time with zero power consumption), ijpeg can consume maximum CPU power. However, when gqview is active, ijpeg is limited to its 4000mW allocation. There is little energy capacity remaining when the battery lifetime is reached (less than 1%).

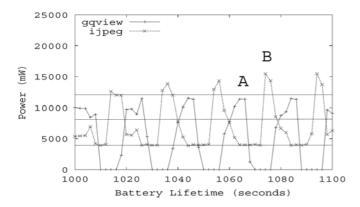


Figure 3 Currentcy conserving allocation. The three horizontal lines represent (from top to bottom) the total allocation, the allocation for gqview, and the allocation for ijpeg. At point A, gqview is active, so ijpeg is limited to its allocation. At point B, gqview is in its think time, so ijpeg can benefit from its unused currentcy.

#### E. Summary

ECOSystem continues to provide a productive environment for investigating unified energy management. Our results so far have shown that the currentcy model is a powerful framework for expressing energy management policies and that our currentcy-based policies, by being able to capture aspects of global energy use, can provide more coherency to system-wide energy management. We plan to incorporate more components into the explicitly managed set of devices and experiment with other energy-related problems.

#### III. ENERGY MANAGEMENT FOR MEMORY

## A. Power-Aware DRAM Technology

In addition to components that our ECOSystem prototype can manage on existing laptop platforms, the Milly Watt group has considered emerging technologies that have not yet become widely integrated into products. With the recent introduction of DRAM chips that allow transitioning between power states (e.g., Rambus RDRAM and Intel Mobile-RAM), there are opportunities to consider the role of the operating system in the energy management of main memory. First, we introduce the hardware characteristics we assume.

Power-aware memory chips can transition into states that consume less power but introduce additional latency to transition back into the active state in order to be accessed. The lower the power consumption associated with a particular state, the higher the latency to service a new memory request.

The memory controller can exploit these states by implementing dynamic power state transition policies that

respond to observable memory access patterns. We have explored controller policies that are based on the idle time between runs of accesses (which we refer to as *gaps*) and threshold values to trigger transitions [5]. Figure 4 illustrates a policy that transitions between active and powerdown modes. While the memory has outstanding requests, the memory chip stays active. Upon the completion of those requests, the chip automatically goes to standby. When the idle time exceeds a threshold (e.g., gap *i*), the chip transitions into powerdown and stays there until the start of the next access (the end of the gap). For gaps shorter than the threshold (e.g., gap *j*), the memory remains in standby.

Our results, based on simulation and analysis, have

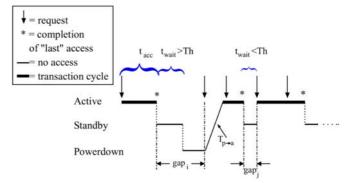


Figure 4 Memory access behavior. This shows the relationship of thresholds, gaps, and state transitions in a 2-state memory controller policy.

explored how to determine the best threshold values [6, 7] given the gap distribution from a particular workload. We have found that in many cases, a good static threshold policy is to transition immediately (i.e., a threshold equal to zero).

We have also investigated the synergy between power-aware memory and dynamic voltage scaling [8]. We have shown that the interaction between these two technologies affects both memory controller policies and scheduling policies.

#### B. The Role of the OS: Power-Aware Page Allocation

Given dynamic memory controllers managing the power states of the memory chip, we next consider how the operating system can facilitate better energy efficiency. The virtual to physical page mapping can be tailored to cluster pages into the fewest number of chips or with pages of similar access patterns or activity levels.

Our study of page placement policies [5] assumes the characteristics of Rambus DRAM – the power states as well as the high bandwidth possible from a single chip. This feature allows pages to reside within a single chip rather than be interleaved across chips. In this context, sequential first touch page allocation in conjunction with memory controller policies that dynamically adjust the power mode of each individual chip independently produces dramatic simulation results. For a set of memory traces from popular productivity applications and from SPEC benchmarks, we have found improvements of 80-99% in an energy\*delay metric over traditional full-powered memory devices. Related work [9] proposes that the OS do the transitions at a context switch.

#### IV. DISPLAY MANAGEMENT

#### A. The FaceOff Design

The display is another major consumer of power in a typical battery-powered device. The display exists solely for the purpose of user interaction and therefore it is only necessary when someone is looking at it. There are many times when a user may turn her attention away from the computer display, perhaps to answer a phone call or to focus on some other distraction. On the other hand the conventional display power management scheme that is based on a timeout from a lack of user input events may be too aggressive for some applications. A user reading an electronic book or examining a web page with complex content might experience the annoying behavior of the display timing out.

Based on the simple intuitive idea that the display is not needed if no one is looking at it, we evaluate our power management method, called FaceOff, that uses a web cam mounted to the display of a laptop as a sensor [10]. The camera periodically captures images and a face detection algorithm determines the presence or absence of a user looking at the display. The display is turned off and back on based on the results of the face detection. Detecting an area of skin color in the image has proved adequate for our purposes.

## B. Prototype and Preliminary Results

We have built the FaceOff prototype on an IBM T21 Thinkpad running Red Hat Linux. The camera is a color Logitech QuickCam 3000 web cam that connects via USB to the laptop with an average measured power consumption of 1.5W. The display power states are defined in the ACPI specification and supported by both the laptop hardware and the operating system. On this laptop, the display consumes approximately 8.5W. In the future, FaceOff will be integrated into ECOSystem.

Preliminary experiments with our prototype have been done to determine whether this method can produce a measurable reduction of energy consumption in the system even after accounting for the added computing energy costs for the face detection algorithm and the energy consumed by the camera. The results are encouraging. The addition of a very low power motion sensor is proposed to avoid overhead during long user absences. Future work will study the user's experience with FaceOff.

#### V. CONCLUSION

ECOSystem, power-aware page allocation, and FaceOff span the typical components of a mobile computing platform. Our goal is to take a system-wide view and show that unifying resource management in terms of energy management is a promising approach.

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# Modeling and Optimization of Embedded Systems using Constraint Programming

Krzysztof Kuchcinski

Abstract—In this paper we briefly discuss embedded computer systems and related design problems. We propose to use constraint programming methods to solve many of these problems in a way that is elegant, flexible and efficient at the same time. First, we briefly introduce finite domain constraints and then give a very simple scheduling and functional units assignment example taken from high-level synthesis area. We then provide a short list of other selected applications for our approach together with related references. Finally, we conclude our discussion by pointing out several advantages of our approach.

*Index Terms*— Embedded systems, high-level synthesis, system synthesis, constraint programming.

## I. INTRODUCTION

MBEDDED computer systems typically perform specific functions, such as process control, digital signal processing, image processing or multimedia applications. They are usually specified by communicating concurrent processes and implemented in software and hardware in a distributed heterogeneous environment. The software is executed on a processor or several processors while hardware is usually provided as specialized ASICs. The communication channels are implemented by buses, point-to-point links or shared memories.

An important part of distributed embedded system design space exploration is partitioning of the system specification into processors, ASICs and communication channels as well as mapping and scheduling of different system functions on available resources. Possible system implementations are supposed to meet specified performance while providing a cost efficient system architecture. Several other constraints, such as power consumption or fault-tolerance, might be also considered. The design space exploration usually takes into account possible system structures, different design constraint as well as the execution profile of the system together with parameter estimation and tries to find different design alternatives.

Different modeling and optimization approaches have been proposed for embedded systems. The most common approach is based on different kind of graph-based models. The system functionality is modeled using graphs or more complex formalism, such as Petri nets. The optimization and design space exploration phase is based on different heuristics which are applied for specific design problems.

Integer Linear Programming (ILP) or Mixed Integer Linear Programming (MILP) based approaches are also considered. These methods produce optimal solutions while suffering

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usually from long execution times and practical limitation on the size of the problem. The MILP method requires a careful formalization of the problem as a set of linear inequalities. Usually, two types of variables are used; system parameter variables, such as timing variables, and binary variables. While the system variables represent real values assigned to system parameters, the binary variables are introduced to represent implementation decisions regarding the system configuration. The number of the binary variables and the related inequalities tends to be very large, even for moderate size problems, which results in long execution times for finding optimal solutions.

In this paper, a new method for embedded system modeling and optimization is presented. This method is based on constraints solving techniques [1]. A system is specified by a set of constraints over the finite domain of integers. The constraints are given as inequalities and specialized combinatorial constraints, and specify system constraints as well as resource constraints. The constraint solving techniques are then used to find different solutions, optimal or suboptimal ones, which satisfy given constraints and optimize a given cost function. In our case, in addition to constraint consistency techniques we use a branch and bound algorithm with depth-first-search or partial-depth-first-search methods to find a system implementation. The prototype constraint programming system, JaCoP, has been implemented in Java (see, for example [2]) and tested on many examples. This paper summarize our previous studies and related results which has been published.

Our approach uses extensively constraint programming to address different embedded systems design problems ranging from partitioning to scheduling and memory assignment. We make an extensive use of finite domain constraints without limiting them to linear equations and inequalities. We also combine application constraints and resource constraints and propose a new constraint representation for different design problems. Finally, we use constraints for design space exploration and design optimization. The optimization minimizes an explicitly given cost function while satisfying constraints set.

The design flow of our approach is depicted in Figure 1. The constraints are extracted from a design specification as well as defined by a designer. Optimization criteria, if needed, are also defined as constraints. All defined finite domain variables (FDVs) and constraints are then placed in a store that is later used by a solver to find a solution. The solver uses constraint consistency and entailment (satisfiability) methods to keep the store consistent while searching for a solution. Search methods find an assignment to FDVs that satisfies all constraints imposed on these variables. The solver offers a number of

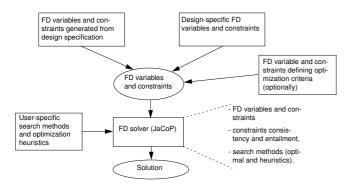


Fig. 1. The general structure of our constraint-driven scheduling and resource assignment system.

general purpose search methods and optimization algorithms but a user can still define his own methods and heuristics. Since we keep the same representation for all constraints we have a unified framework that makes it possible to integrate different algorithms for enforcing constraint consistency and checking their entailment as well as different search methods.

The rest of this paper is organized as follows. Section II introduces finite domain constraints. These constraints are later used in section III to illustrate how a simple design problem can be modeled and used for optimization. We also point out other applications of constraint programming published in our previous papers. Finally, the conclusions are presented in section V.

# II. FINITE DOMAIN CONSTRAINTS

Finite domain constraints are used in our approach to specify different properties and restrictions imposed on the specified design. We first introduce a constraints satisfaction problem (CSP) for finite domain constraints and then present our formulation of the digital system modeling in terms of these constraints.

CSP is a 3-tuple S = (V, D, C) where

 $\mathcal{V} = \{x_1, x_2, \dots, x_n\}$  is a finite set of variables, also called finite domain variables (FDVs),

 $\mathcal{D} = \{\mathcal{D}_1, \mathcal{D}_2, \dots, \mathcal{D}_n\}$  is a finite set of domains, and  $\mathcal{C}$  is a set of constraints restricting the values that the variables can simultaneously take.

For each variable  $x_i$ , a finite set  $\mathcal{D}_i \in \mathcal{P}(\mathbb{Z}) \setminus \emptyset$  of possible values constitutes its domain, called a finite domain (FD). For example, the specification  $T::\{1..10\}$  defines FDV T, which can have values 1, 2, ..., and 10 while the specification  $R::\{23,56\}$  defines FDV R, which can have a value of either 23 or 56.

A constraint  $c(x_1,x_2,\ldots,x_n)\in\mathcal{C}$  between variables of  $\mathcal{V}$  is a subset of the Cartesian product  $\mathcal{D}_1\times\mathcal{D}_2\times\ldots\times\mathcal{D}_n$  that specifies which values of the variables are compatible with each other. In practice, the constraints are defined by equations, inequalities, combinatorial constraints, or programs. We use this convenient method to define constraints. For example, an inequality  $T_1+D_1\leq T_2$  defines a constraint on three FDVs  $T_1$ ,  $D_1$  and  $T_2$ .

Each constraint can be in one of three states: *satisfied*, *not satisfied* or in a state that cannot yet determine whether

 $\label{eq:table I} \mbox{TABLE I}$  Different States of Constraint X < Y

X :: 15, Y :: 610	X < Y satisfied
X :: 610, Y :: 15	X < Y not satisfied
X :: 110, Y :: 110	X < Y 'don't know'
	after consistency enforcement
	X :: 19, Y :: 210

the constraint is satisfied or not ('don't know' state). If the constraint is in the 'don't know' state the consistency enforcement for this constraint can be applied. A particular program that implements a consistency method is also called a propagator since it propagates changes in FDVs to domains of all FDVs, involved in a given constraint, by narrowing their domains. Combinatorial constraints are usually implemented using several propagators that consider different aspects of their consistency. Table I illustrates different states of constraint X < Y, for example.

A solution s to a CSP  $\mathcal{S}$ , denoted by  $\mathcal{S} \models s$ , is an assignment to all variables  $\mathcal{V}$ , such that it satisfies all the constraints. There usually exist many solutions that satisfy the defined constraints. They have different quality, which is defined by a related cost function. In most design problems, we are interested in optimal solutions that minimize or maximize this cost function. An optimal solution s to a CSP  $\mathcal{S}$  is a solution  $(\mathcal{S} \models s)$  which minimizes or maximizes a value v assigned to a selected variable  $x_i$ .

The standard method to find a solution to a CSP is to systematically assign FDVs with values from their domains. After each assignment the consistency of all constraints that contain changed FDVs is carried out. The process finishes when each variable has a value. If during the assignment an empty domain for a FDV is detected the process fails and backtracking is initiated. This is usually implemented as a depth-first-search method and the optimization uses some kind of branch-and-bound algorithm.

The efficiency of constraint programming methods is improved by using combinatorial constraints. These are constraints which encapsulate a particular problem and offer more efficient propagation methods than collection of primitive constraints. This is achieved by implementing algorithms known from operation research, mathematics, geometry, etc. For discussion on combinatorial constraints for scheduling see, for example [3]. Combinatorial constraints, such as cumulative and diff2 constraints, are used heavily in our approach.

The diff2 constraint, for example, defines restriction on placement of 2-dimensional rectangles. It takes as an argument a list of such rectangles and assures that they do not overlap. In our approach, we use the diff2 constraint mainly for definition of resource assignment constraints. In this case, a rectangle represents a task.

#### III. MODELING WITH CONSTRAINTS

In this section we will present simple constraint programming formulation of a scheduling problem taken from high-level synthesis. This formulation is based on well-known dataflow graph (DFG) representations.

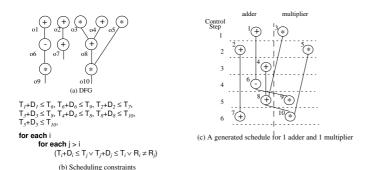


Fig. 2. A simple data flow graph, scheduling constraints and its possible schedule.

Assume that we have a set of partially ordered operations or tasks. We use the terms *operation* or *task* in a general sense. They represent an atomic computation such as addition or multiplication in HLS or a specific algorithm such as discrete cosine transform in system-level synthesis. The partial order is usually represented using DFG as depicted in Figure III.a.

We first define FDVs specifically for this problem and later define resource assignment and scheduling requirements as finite domain constraints. For each operation,  $o_i$ , we define three FDVs,  $T_i$ ,  $D_i$  and  $R_i$  which represent the start time of the operation, the operation's delay and the resource used for its execution, respectively. Figure III.b depicts constraints defined for scheduling the DFG. First, operation precedence constraints for operations  $o_1$ ,  $o_2$ , ...,  $o_{10}$  are defined as inequalities. After that constraints on resource sharing are defined. They prohibit resource sharing at the same control step and are defined using three disjunctive constraints for each possible combination of operations.

A simple schedule for this example, which uses one adder and one multiplier (both with one clock delay), is depicted in Figure III.c. This schedule is found using a standard solving method provided by constraint programming. This method finds a solution to the imposed constraint by systematic assignment of values to FDVs. Consistency of all constraints is enforced after each assignment. This prunes domains of FDVs and reduces the size of the search space. Combination of the FDVs assignment and branch-and-bound techniques provides standard optimization method for constraint programming.

The example can be further improved by replacing all disjunctive constraints constraints imposed in two for each loops by single diff2 constraint [2].

## IV. ADVANCED MODELING ISSUES

Various assumptions on tasks and scheduling methods can produce different scheduling constraints. Our formulation makes it possible to easily model multicycle operations, chaining or pipelined components in HLS. Algorithmic pipelining can also be modeled and solved efficiently [2].

HLS with conditional behaviors creates new challenges for optimization. It is difficult since it introduces new optimization opportunities by exploiting conditional resource sharing and speculative execution. Our methods provide a way to model multicycle operations and chaining together with conditional

resource sharing and speculative execution. We can assign both functional units and registers while making possible to conditionally share these components [4].

Register assignment traditionally requires careful analysis since registers can be shared between different variables. This assignment is decided based on the lifetime analysis of variables. The lifetime analysis, usually performed after scheduling, determines a time interval when a variable is valid and needs to occupy a register. In our approach, the lifetimes of variables can be modeled using rectangles (diff2 constraint) that span on time axes during define-use time of variables [2]. This makes the modeling very easy and clear as well as introduces opportunity to make scheduling and register assignment simultaneously.

A solution of the imposed constraints provides a feasible schedule which fulfills all requirements (i.e., imposed constraints). Optimization can try to minimize different design parameters, such as the number of time steps, cost of used resources, power consumption, register/memory usage or a combination of these. In addition to standard constraint programming optimization methods, based on branch-and-bound principle, one can develop heuristic methods for specific design problems.

Constraint programming environment offers a flexible environment for solving different design problems. For example, it is possible to handle different scheduling problems while providing good performance. This is achieved mainly by efficient use of combinatorial constraints. These constraints provide efficient algorithms for narrowing domains of FDVs. More discussion on applying specific combinatorial scheduling and resource constraints for embedded system design problems can be found in [2], [4]–[8].

Our approach has been evaluated using both commercial solvers [9], [10] as well as a constraint programming library developed specially for our purpose [2]. This constraint programming library, called JaCoP (Java Constraint Programming environment), offers a set of constraints and search methods for problems found in embedded system design.

Different extensions to model task graphs and related system scheduling and assignment constraints has been studied and included in our formulation [8]. Our approach can handle these design problems and offers new modeling opportunities. For example, constraint programming can be used for design space exploration and examination of different parameters, such as execution time, cost, memory consumption, and energy (see, for example [11], [12]). In [13], an algorithm which examines execution time and energy consumption of a given application, while considering a parameterized memory architecture, is presented. This algorithm produces Pareto trade-off points representing different multi-objective execution options for the whole application.

Constraints can be used to narrow design space by making partial decisions. This idea is exploited for task clustering problem and presented in [14]. Instead of clustering tasks, it is proposed to add additional constraints on task assignment and achieve reduction of design space. This approach can handle non-linear clusters which traditional clustering cannot because

of deadlock problems.

## V. CONCLUSION

In this paper, we have briefly presented the method for embedded system modeling and design. Our method uses finite domain constraints to model such systems and related constraint solving techniques to find a final system implementation. The presented approach makes it possible to mix different types of constraints in a single model and use different search methods as well as different optimization techniques. Both complete and heuristic search methods are possible and therefore this approach is feasible in practice for large design problems that cannot be solved exactly. Optimal solutions can be found when using complete search methods while the search space might be artificially cut for heuristic search techniques.

Our approach, based on CP techniques, for system modeling and design has several advantages that can be summarized as follows:

- Constraints can be used to formalize both a system model and non-functional requirements of different types. The final set of constraints specifies uniformly all requirements on an implementation.
- A set of constraints can be easily extended with new constraints to accommodate new requirements on a design without changing related synthesis algorithms.
- Different constraint solving techniques, heuristics and complete optimization methods, can be used to solve the constraint model of the system.
- The use of constraints improves the general quality of a design process by providing a way to control all constraints in the same environment and assuring fulfillment of all constraints.
- It provides a unifying framework for different constraint consistency algorithms which, by narrowing domains of finite domain variables, contribute to a solution satisfying all constraints.

The experimental results, published in different papers, prove usability of CP approach. It is competitive to both (M)ILP approaches and domain specific heuristics. It usually can provide good solutions in a reasonable time. On the other

hand CP offers possibility to incorporate well known heuristics. It is interesting approach since for the same model we can use optimal methods, meta-heuristics or domain specific heuristics.

Concluding, the CP approach to embedded systems design provides an attractive alternative to both domain specific heuristics and optimal methods based on (M)ILP.

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# Embedded Systems Computer Architecture

(Extended Abstract)
Jakob Engblom

Abstract—Embedded systems are computer systems used as components in other systems. It is a very broad field encompassing a large number of very different requirements, and the computer architecture of embedded systems reflects this variation by a large degree of specialization to application areas.

Index Terms— Embedded Systems, Computer Architecture

## I. INTRODUCTION

Embedded systems are computer systems used as components in other systems. It is a very broad field encompassing a large number of very different requirements, and the computer architecture of embedded systems reflects this variation.

By their nature, embedded systems are *special-purpose systems*. In general, compared to a desktop or server machine, the computer employed in an embedded system will address a rather narrow, well-known, and fixed application. This makes it possible to specialize the computer architecture to address this particular application.

The performance demands of the system are usually well-defined at the design stage, and they are not likely to change over the lifetime of the system. This means that the performance and capabilities of an embedded system are targeted to the needs of the application. Extra performance or extra features over and above the particular needs of the application are a waste, not a feature. Sufficient performance is indeed sufficient. This is why billions of old 8-bit processors are still sold every year into the embedded market – for many tasks, they offer an acceptable solution.

There are three factors that need to be balanced to determine the perfect computer base for an embedded system. The *performance* has to be sufficient. The *cost* has to be minimized. The *power consumption* (and heat production) has to be within design bounds. It is hard to satisfy all three goals simultaneously. Low power and low price also means low performance. Higher performance usually brings with it higher power consumption. Getting high performance cheap is always difficult. Sometimes, systems will need to be redesigned or specifications changed to accommodate the available processing power. Your mobile phone cannot currently have 3D graphics that can compete with a desktop PC, due to power and size constraints.

The best balance of power, performance, and cost is usually found in computer architectures specialized towards

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a certain task. Barring a huge difference in production volumes, a general-purpose machine will always cost more and use more power than a special-purpose machine for the same problem. This is what gives the embedded systems space its unique diversity and room for innovation.

One consequence of the attractiveness of specialized processing is that a system will often have multiple processors, each specializing in a particular type of task. A common distinction is between two styles of processing: control plane and data plane. The control plane is the part of a system that makes decisions and controls its behavior; it is usually dominated by decision making and data lookup. For example, in a telephone switch, this includes setting up the circuit for a phone call. The data plane, on the other hand, is the part of the system that is in charge of processing and shuffling data around; it is dominated by repetitive data movement and computations. In the phone switch example, this is the part that actually transports the sound stream from sender to receiver. Once the control plane has set up a call, the data plane will take over and do the work as long as the call is connected. This model, splitting control decisions and data is quite common, even though it obviously does not cover all embedded systems.

A final property of embedded systems that is often overlooked is the longevity of the systems. Many embedded systems, especially in the military and aerospace fields, have very long lifetimes, often reaching into decades. This makes future parts and tools availability a big issue in the design phase, as longevity has to be planned for.

#### II. EXAMPLES

To give an idea for the wide span of systems that can be called embedded, we will go through some examples.

An advanced toy like the Lego Mindstorms robotics construction kit contains a fairly simple processor: an 8-bit Hitachi H8 processor with 32k of ROM and 32k of RAM provides the brains for this quite sophisticated system. This offers a cheap and effective solution for creating a very fun smart toy.

A typical (non-smartphone) GSM phone contains a number of processors. An 8-bit processor might take care of the user interface, games, etc., while a 16-bit DSP provides the processing power necessary for digital voice encoding and decoding. Apart from these main processors, the Bluetooth unit in the phone contains an embedded 32-bit RISC processor used to process the communications protocol, as does the IR port. For smartphones that integrate more functions, 32-bit main processors are becoming necessary. So what we have is a small portable multiprocessor system.

Modern cars from manufacturers like Volvo, BMW, or Mercedes contain up to a hundred embedded processors.

Some are powerful 32-bit processors used in engine control and similar compute-intensive tasks, while most are simpler 16-bit and 8-bit processors used to control various functions around the car (windows, locks, ACC, ABS brakes, etc.). The processors communicate with each other using buses like CAN, LIN, and FlexRay. Cars are extremely heterogeneous distributed systems. Since cost control is of essence for mass-production items like cars, each electronic unit is cost-minimized, even at the expense of a somewhat higher software development cost (since development costs are one-time expenses, while per-unit costs are incurred for each car produced). The processing power in cars is located where things need to happen; centralization is not an option.

Telephone systems contain a large number of embedded systems with varying computational needs and styles. For example, mobile phone base stations are computation-intensive digital signal processing systems. Such systems contain huge numbers of 32-bit or floating-point DSP processors to encode and decode radio signals and maintain the connections to the mobile phones. It is a very parallelizable system: each active phone requires the same processing of independent data, giving thousands of independent computation threads to spread across the DSP processors. They offer an almost perfect parallel workload. Several startups have tried to address this market with heavily parallel architectures.

Enterprise networking equipment like switches, routers and storage controllers make up another class of embedded systems. They are often quite similar to regular computers, containing one or a few 32-bit or 64-bit RISC processors, and running an operating system like Linux. However, the architecture is optimized to the movement of large amounts of data through the machine, using special line cards to take care of moving data while the main processor is only rarely involved. For the highest-capacity systems, custom CPU architectures are often employed, since regular processors are not well-suited to the task of packet processing.

Large military systems like radar stations and combat ships require enormous amounts of processing power, and here one can find regular multiprocessor servers working as embedded systems; albeit in special military-hardened cases. Even a Sun server can be considered an embedded system in the right circumstances! Often, military systems have tight space requirements, as ever more computing power is retrofitted to designs intended for far fewer computers.

Space-based systems offer another extreme: they need to employ special radiation-hardened cores and seldom enjoy the luxury of high clock frequencies or 32-bit processors.

# III. THE MARKET

Embedded processors make up about 98% of all processors shipped (by number). Of about eight billion processors manufactured each year, only around 200 million find their way into desktops and servers. Looking at the overall semiconductor market, processors only make up about 2% of the numbers of parts sold, but about 30% of the revenue. So processors are clearly the highest margin part of the market to be in.

In the processor market, while 4-bit and 8-bit processors make up about 70% of the numbers, they only contribute a

tiny faction of the money. 32-bit and 64-bit processors (embedded or not) get more than 65% of the overall processor revenue, even though they are less than 10% of the numbers. Within the 32/64-bit category, desktops and servers takes almost all the money (50% of all processor revenue), thanks to the much higher price of server and desktop processors (usually hundreds of dollars apiece) compared to embedded processors (maybe tens of dollars, often less) [1].

So while embedded processors are dominant by numbers, we can see that it is very different on the revenue side. But 32-bit embedded processors are still a healthy and rapidly growing market that keeps attracting newcomers. ARM (<a href="https://www.arm.com">www.arm.com</a>), today's most common 32-bit architecture, is produced in about 600 million units per year.

ARM is a good example of a business model peculiar to the embedded world, the licensable processor house. ARM designs processor cores and licenses them to other companies who then create products containing the ARM cores (combining the core with various devices and memories to create sellable chip); ARM does not produce any chips of its own. This business model is also used by MIPS (<a href="www.mips.com">www.mips.com</a>), ARC (<a href="www.arc.com">www.arc.com</a>), Tensilica (<a href="www.tensilica.com">www.tensilica.com</a>), and others

#### IV. PRODUCT CATEGORIES

The embedded processor market defines itself around a number of product categories, vaguely defined and featuring extensive overlap, but nevertheless they help organize and understand the market place.

# A. Microprocessors

The classic microprocessor is a chip that contains just a processor, nowadays usually with integrated caches and sometimes memory controller. This is your SPARC, Pentium, and PowerPC processor found in regular office computers. Standalone processors are sometimes found in embedded systems, especially when lots of processing power is needed.

#### B. Microcontrollers

A *microcontroller* is the traditional embedded processing part. It encompasses not only the processor core, but also a number of peripheral devices like timers, serial ports, A/D converters, and network interfaces, along with some amount of program and data memory. The goal is to reduce the number of external chips needed, in order to minimize cost. Most microcontrollers are based on 8-bit or 16-bit processing cores, with a few kilobytes of data RAM and up to half a megabyte of ROM or FLASH memory for code. Typical microcontrollers are the Atmel AVR (www.atmel.com) and Microchip PIC (www.microchip.com) families.

# C. ASIP/ASSP

Recently, the term application-specific instruction set processors (ASIP) or application-specific standard parts use come (ASSP) into "super-microcontrollers". These chips take the level of integration on a single chip to new heights, based on the enormous number of transistors available in 130nm or smaller silicon processes. They are also "application-specific" in the sense that they are quite narrowly targeted to particular applications, and aim to

replace the traditional development of custom hardware. Multiple cores and 32-bit processors are common in ASIP/ASSPs.

One good example are the Texas Instruments (www.ti.com) OMAP chips, which integrate an ARM core with a DSP core, memories, LCD and keyboard drivers, and other devices to put most of the logic of a mobile phone onto a single chip.

Infineon (www.infineon.com) has a family of chips built around the C167 core that are very popular in automotive applications. The C167 chips feature multiple on-chip CAN controllers, waveform generators, A/D and D/A converters, and many advanced timers.

Sometimes, ASIP/ASSP chips are billed as *System-on-a-Chip* (SoC) solutions. The term "SoC" has been getting very popular in recent years to denote highly-integrated chips that encompass all parts of a complete system, especially in the context of ASIC design (see below).

One particular class of ASIP/ASSPs are the *network processing units* (*NPU*). NPUs are chips designed specifically for networking applications, and include both control-plane and data-plane components. IBM's (<u>www.ibm.com</u>) NP chips and Intel's (<u>www.intel.com</u>) IPX are quite typical, combining a standard processor core with a large number of semi-programmable data pumps.

# D. ASIC

Application-Specific Integrated Circuits (ASICs), are the ultimate embedded processing devices. ASICs are fully custom chips designed by the end user for the needs of a particular application. They can contain control logic, processing cores, memories, devices, buses, and whatever else an application might need.

Designing an ASIC is a very expensive process, and you will need large volumes or very special needs for it to be a viable proposition. As the number of gates that can be fit on a chip increases, ASIC design becomes ever more complex. The economics of ASICs are like classic printing: you have a high fixed setup cost to create the set of *masks* used to print the ASICs, but once the setup is done, the cost per unit is small. The more units you create, the lower the per-item cost will be.

One way to speed the design is to buy complex components from *intellectual property (IP)* providers. Most standard parts of an ASIC can be bought, from the simplest serial ports to processor cores. Processor cores (discussed briefly above) are the largest part of the IP business, since processors are the most complex part to design in-house (not to mention the need to create support tools like assemblers and compilers).

In some cases, ASICs include full-blown home-made special-purpose processors. A classic example is Ericsson's (<a href="www.ericsson.com">www.ericsson.com</a>) APZ processor, used in the AXE series of digital phone switches. It is a very specialized architecture designed for the single application of phone switches. Another example is Cisco's (<a href="www.cisco.com">www.cisco.com</a>) Toaster series of switch processors; standard processors cannot process packets fast enough for high-end parts, so a special architecture was needed. None of these are available outside

the respective companies, making them ASICs and not microprocessors.

# E. FPGAs

Field-Programmable Gate Arrays, FPGAs, are "soft hardware". They are hardware chips whose function can be change by updating the contents of configuration memories. FPGAs are built from cells, small units implementing a small piece of logic controlled by configuration date. The cells are connected with a programmable interconnect to form complete circuits.

Compared to ASICs, FPGAs implement the same function in a much less efficient manner. Due to the obvious overhead in the implementation, FPGAs clock lower, exhibit higher power consumption, and contain fewer available logic gates. They also cost more per unit. But they are *reprogrammable*, and there is no setup cost like ASICs. This makes FPGAs more flexible and cheaper to design and work with.

FPGAs have always been popular as prototyping and validation tools: hardware designs can be validated by creating an FPGA and testing it, which is much faster and cheaper compared to creating a version of an ASIC.

In recent years, as costs for ASICs have increased drastically (startup costs are hitting millions of dollars for 130 nm and 90nm processes), FPGAs have become an alternative to ASICs in production units, especially for low-volume products. Currently, experts estimate that at volumes below hundreds of thousands of chips, FPGAs are more economical than ASICs. FPGAs also offer the possibility to fix bugs in the field by updating the FPGA programming.

Leaders in the FPGA field are Xilinx (www.xilinx.com) and Altera (www.altera.com). Since FPGAs (like all hardware logic) are best at parallel processing tasks with fixed functionality, some products combine regular processor cores with FPGA fabrics. The processor core takes care of unpredictable processing, while the FPGA part is used to accelerate processing suited to hardware implementation.

# V. COMPUTER ARCHITECTURAL CHARACTERISTICS

Embedded computer architecture is much more diverse than general purpose desktop architectures. While it is to some extent true that technology trickles down from the PC/server market to embedded, there are many unique innovations occurring in the embedded market.

#### A. Instruction Sets

One peculiarity of the embedded market is that old architectures never die. Even in 2004, there will be billions of 8051s, Z80, and PIC chips sold: all 8-bit machines with instruction sets dating back to the 1970s. Also, the embedded market has given a second life to RISC architectures like MIPS that have faded from the general-purpose computer market. Furthermore, instruction set design goals and trade-offs are somewhat particular.

Code size is an important factor in most embedded designs, and instruction sets are designed and extended with code size in mind. Fairly typically, the NEC V850 (<a href="www.nec.com">www.nec.com</a>) architecture uses 16-, 32-, 48-bit, and 64-bit instructions to encode a RISC-style instruction set. The 32-bit ARM and

MIPS architecture have been extended with reduced 16-bit instruction sets in order to reduce the code size. Instructions that perform a lot of work, like loading multiple values from the stack, are popular to reduce code size.

Instruction sets are also extended with instructions to accelerate particular processing tasks. For example, Motorola's (<a href="www.motorola.com">www.motorola.com</a>) 68300 processors have a special table lookup and interpolate instruction to accelerate engine control tasks.

Of particular note are the *DSP* (*Digital Signal Processing*) instruction sets. DSP processors are specialized to performing data-plane processing, designed to take advantage of the regular structure of most interesting program loops, and with special instructions for common tasks (for example, FIR filters can be implemented with a single instruction on a TI C65).

The most extreme example of application-adapted instruction sets are offered by the *configurable processors*. Tensilica and Arc are the leaders in this field, where processor cores are customized by selecting which particular instructions to include in a particular configuration. It is also possible for the user to create new instructions to accelerate particular tasks.

# B. Memory Systems

Embedded systems often feature quite complex memory systems. Caches are normally quite simple, featuring single-level instruction and data caches. However, the caches are often complemented with *tightly-coupled memories* (*TCM*), fast on-chip memories that are under programmer control and not automatically managed by the cache system. Compared to caches, TCMs are more predictable (good for real-time systems) and use less power (thanks to reduced complexity). For IP cores, the size of caches and TCMs is usually configurable.

Memory is preferably kept on-chip to reduce power consumption and product cost: adding external memory chips is fairly expensive both in terms of production cost and power consumption. Usually, code is kept in ROM or FLASH memory on-chip, with a much smaller RAM memory for storage of variables and stacks (most embedded systems follow the classic "Harvard" design of separating code and data physically). EEPROM or FLASH memory is used to keep persistent data when the system is powered off. High-end systems require off-chip memories: even today, it is hard to fit more than a few megabytes of memory on-chip.

On 8-bit and 16-bit architectures, pointers are limited in size. To accommodate larger memories, there is usually a hierarchy of memory areas and pointer types. There might be a *zero-page* memory which is addressed using an 8-bit pointer, with a "near" memory with 16-bit pointers, and various forms of "far" memory with 24- or 32-bit pointers. This leads to a programming model where the programmer needs to be aware of the allocation of variables to memory in order to efficient programs.

# C. Pipelines

Pipelines in embedded processors tend to be simpler than their desktop counterparts, since the goal is to provide adequate performance with minimal cost and power consumption. For example, the ARM926 core requires up to 0.9 mW/Mhz; while the Pentium 4 uses about 35 mW/Mhz. The cost to go from acceptable to maximum performance can be very high!

8-bit and 16-bit processors are usually not pipelined at all, while 32-bit processors use everything from the simple 3-stage pipeline of the ARM7 to complex multiple-issue out-of-order pipelines on 64-bit MIPS systems. Currently, most 32-bit machines have moderately complex pipelines with 5 to 7 stages and strict in-order issue. Every generation of embedded processor cores tend to add a few more features in order to add processing power, but it is always done within the constraints posed by cost, size, and power consumption.

Since the tasks requiring the most processing power are usually well-known, they can be more efficiently solved by using hardware accelerators or special processors instead of a faster general-purpose processor. This leads to the classic RISC-DSP split of processing in mobile phones, and the use of special acceleration hardware for tasks like MPEG decoding.

There are also some truly extreme designs in the embedded field. Xelerated's (<a href="www.xelerated.com">www.xelerated.com</a>) network processors use a pipeline more than 1000 stages deep to efficiently rout and filter network packets. Texas Instruments are successfully selling eight-wide VLIW DSP processors for customers requiring very high performance signal processing.

#### VI. SUMMARY

This talk has given a quick overview of the embedded computer architecture field. I have tried to give a feeling for the broadness of the embedded systems field and the wide range of particular computer designs that have been created to correspond to the many peculiar needs of the various end-user applications.

The main fact to remember is this: there is no typical embedded system, and any computer architecture feature ever invented is bound to have a valid application somewhere in the embedded systems field.

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# Compilation for Embedded Processors

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Abstract—This article gives an overview of the field of compilation for embedded processors. First, typical characterisitics of embedded processors are summarized that have to be taken into account in order to generate high-quality machine code. A lecture concept is outlined which starts by introducing the necessary basics of compiler technology, then details the specific requirements of compilation for embedded processors and concludes with an overview of recent research in this field. The lecture was held in the Embedded Systems Schummer School ESSES 2003. The article concludes with a literature survey that can serve as a starting point for further research in this area.

Index Terms—Compilation, Code Generation, Embedded Processors, Retargetability, Code Compaction, Postpass Optimization.

#### I. Introduction

BMBEDDED systems are increasingly becoming a fixed part of everyday's life. Already today, the vast majority of all microprocessors sold are used in embedded systems; application fields comprise healthcare technology, telecommunication, automotive and avionics, multimedia applications, etc. The main requirement imposed to embedded systems is high efficiency: high performance must come at low cost and at low power consumption. This has led to the development of irregular hardware architectures specially designed for real-time applications and digital signal processing.

The architectural irregularity of many embedded processors imposes new challenges to the code generation task. In the area of the classical general-purpose processors, compiler technology has reached a high level of maturity. However, for irregular architectures, the code quality achieved by traditional high-level language compilers is often far from satisfactory [1], [2]. Generating efficient code for irregular architectures requires highly optimizing techniques that have to be aware of specific hardware features of the target processor. The code generation process can be subdivided into several subtasks most of which are NP-complete problems: code selection, register allocation, instruction scheduling, register assignment and functional unit binding. In classical approaches they are addressed in separate phases by heuristic algorithms. Since these phases are interdependent, decisions made in one phase impose constraints to the subsequently addressed phases. This can lead to a suboptimal combination of suboptimal partial solutions resulting in a very poor code quality - especially for irregular architectures [1]. The shortcomings of available compilers have resulted in many embedded applications being developed in assembly language, or at least in part. Here, search-based techniques allowing to model the interactions of code generation phases in an exact way, or combinations of search-based techniques with standard heuristic approaches can lead to substantially better code quality [3], [4].

Due to the growing complexity of embedded applications and the shrinking design cycles of embedded products the usage of high-level programming languages is becoming increasingly imperative. Thus there is an urgent need for *retargetable* code generation and optimization techniques that can be quickly adapted to different target architectures, e.g. by deriving machine-specific properties from a dedicated hardware description. At the same time these techniques must be able to produce high-quality code for the modeled architectures.

Many of today's microprocessors use instruction-level parallelism to achieve high performance. They typically have multiple execution units and provide multiple issue slots (EPIC, VLIW) or deep pipelining (superscalar architectures). However, since the amount of parallelism inherent in programs tends to be small [5], it is a problem to keep the available execution units busy. For architectures with static instruction-level parallelism this problem is especially virulent, since if not enough parallelism is available the issue slots of the long instruction words are filled with nops. For embedded processors this means a waste of program memory and energy. Techniques to exploit the available instruction-level parallelism play an important role in compilation for embedded processors.

While the traditional metrics for compiler quality was the execution speed of the generated code, the mass scale embedded market has caused two other metrics to come to importance: code size and power consumption. One of the most dominant factors in system cost is the die size, in which memory plays an important role. Reducing memory consumption directly translates to reducing system cost and, at the same time, to lowering power consumption. For efficiently reducing code size cross-file optimizations are required [6] which can eliminate redundancies and unused functionality over entire applications. At the same time, they must be able to take advantage of individual hardware characteristics of the target processor.

To summarize, in order to generate efficient code for embedded processors, the following challenges have to be met: exploiting the available instruction-level parallelism of the target processor, efficiently modeling irregular hardware restrictions during code generation, addressing the phase-coupling problem, achieving retargetability, and supporting small code size and low power consumption as alternative code generation goals.

In the follwing, a lecture concept is described which tries to impart the basics of compiler technology required to grasp the specifics of embedded compilation and also addresses recent research in this field. The lecture was held in the Embedded Systems Schummer School ESSES 2003 with a time frame of six hours ([?]).

# II. A LECTURE ON EMBEDDED COMPILATION

The lecture is introduced by an overview of the structure of an optimizing compiler is given. The compiler front end transforms the high-level language input program in an intermediate representation suitable for code generation. It consists of the phases lexical analysis, syntactical analysis and semantic analysis. The middle end performs efficiency-increasing transformations of the intermediate representation, often erroneously termed *machine-independent optimizations*. The compiler backend is concerned with generating the machine code for the target processor. Code generation phases are code selection, register allocation, instruction scheduling and functional unit binding. The phase coupling problem is the result of the inderdependences between all these phases which mostly are NP-complete problems by themselves.

The second part of the lecture addresses the specific code generation problem for embedded processors and explains the motivation for the development of specialized hardware architectures.

Program representations play an important role in code generation. Many compiler phases look at the input program from different views, each of which usually is mapped to a representation of its own. An important concept is to distinguish between high-level intermediate representations describing the input program from a view close to source level, and the low-level representations used to incorporate machine-specific characteristics. The most prominent program representations are syntax trees, (inter-procedural) control flow graphs, control dependence graphs, data dependence graphs, register interference graphs and the SSA form.

The discussion of program representations is followed by a brief overview of standard code generation techniques. Register allocation usually is done by graph coloring algorithms. Instruction scheduling techniques can be classified as local acyclic vs. global acyclic vs. global cyclic approaches. The lecture focuses on list scheduling as a standard local acyclic technique, on trace scheduling and superblock scheduling as global acyclic approaches. The task of code selection can be described by regular tree automata accepting words of regular tree grammars. From this theory, generating a code selector can be formalized as generating a tree automaton for the underlying machine grammar. Examples of current code selector generators are given.

The next part focuses on retargetable compilation. The term retargetability is explained, and an overview of current research on retargetability is given. As an example of a retargetable code generation system the PROPAN framework [3], [4] is presented. At the heart of each retargetable system there is an underlying architecture description language. Architecture description languages can be categorized as structural, behavioral, or mixed-level languages. The design philosophies of these different classes are explained, and the hardware de-

scription language of the PROPAN system, TDL, is presented as an example.

In the remainder of the lecture, advanced code generation topics are addressed. The basic idea of software pipelining as the most prominent cyclic scheduling technique is explained using iterative modulo scheduling as example algorithm. Subsequently, an algorithm to exploit SIMD-style instructions is presented where long registers are loaded with multiple short data values which are simultaneously operated on [31]. Phase coupling problems exist between code selection and register allocation, code selection and instruction scheduling, as well as between register allocation and instruction scheduling. Examples for each scenario are given, and integer programming techniques are presented which address the phasecoupling problem between instruction scheduling and register assignment. The importance of code size as alternative quality metrics is illustrated by an industrial case study: a demo of the commercial postpass optimizer aiPop [55] is given and its structure and algorithms are explained. The last part of the lecture is concerned with program analyses as a prerequisite of most compiler transformations and as stand-alone applications, e.g., to give static runtime guarantees for real-time systems.

## III. LITERATURE OVERVIEW

In the following an overview of relevant literature for the different topics is given. This survey in no way is complete; it is intended to offer a starting point for further research in the area of embedded compilation.

## A. Compiler Design

Text books about compiler construction providing a comprehensive survey of the field are [7], [8], [9], [10]. Publications focusing on the different backend phases are summarized in the following.

- 1) Code Selection: The basic idea of code selector generators can be formalised by the theory of tree parsing and tree automata [11], [8]. The instruction set of the target machine is described by a regular tree grammar. The derivation tree of an expression tree describes a semantically equivalent sequence of machine operations. Cost annotations to the grammar rules permit to locally select a cheapest derivation tree. Early implementations based on [12], [13] used LR-parsing techniques driven by a specification of the target machine by a context-free grammar. The code selector was generated by a parser generator. The limitation was that the code selection for ambiguous instruction sets could not be modelled conveniently. A solution of this problem is to combine pattern matching algorithms with dynamic programming to determine locally optimal operation sequences [14], [15] or extend the pattern matcher to directly selecting locally optimal operation sequences [16]. Examples for contemporary code generators are BEG [17], Twig [18], iburg [19], and OLIVE [20].
- 2) Register Allocation: Typically, register allocation is performed by graph colouring algorithms. Selecting registers is mapped to the problem of finding a k coloring in the so-called register interference graph. Since for k>2 this is an NP-complete problem, usually registers are allocated in a

greedy fashion and heuristics are used in the case that no k colouring can be found. [21] introduces the concept of spill code, [22] suggests splitting life ranges. While the algorithms of [21], [22] are restricted to basic block level, global register allocation algorithms exceed basic block boundaries and take the control flow structure of the program into account. Examples of global register allocation algorithms based on heuristics are the packing algorithm of [23], the probabilistic register allocation of [24] and the optimistic graph colouring approach of Briggs et al. [25], [26].

3) Instruction Scheduling and Parallelization: List scheduling [27] is a widely used local acyclic scheduling algorithm. An algorithm for global acyclic instruction scheduling is Fisher's trace scheduling [28]. The basic idea of this approach is to schedule the operations of consecutive basic blocks jointly in order to increase the available parallelism. The restriction of acyclic techniques is that operations can never be moved across loop back edges. Software pipelining aims at restructuring loops so that operations from different loop iterations can be executed in parallel [29], [30]. In [31] an algorithm to exploit SIMD-style instructions is presented where long registers are loaded with multiple short data values which are simultaneously operated on.

#### B. Architecture Description Languages

Hardware description languages are used for a variety of application areas: for architectural synthesis, hardware simulation, code generation and program analysis. In consequence, a large number of different hardware description formalisms has been developed. In the area of processor modeling and simulating, widely used languages are VHDL [32] and Verilog [33]; approaches used for code generation are ISPS [34], MARIL [35], the SALTO language [36], SLED [37], and nML [38]. Recent developments are ISDL [39], EXPRESSION [40], and  $\lambda$ -RTL [41]. LISA [42] aims at generating cycleaccurate simulators for architectures with complex pipelines. TDL [43] has been designed with the goal to generate machinedependent postpass optimizers and analyzers from a concise specification of the target processor. TDL is assembly-oriented and provides a generic modeling of irregular hardware constraints that are typical for many embedded processors.

## C. Retargetable Compilation and Optimization

In the area of code generation for general-purpose processors there are numerous retargetable systems, e.g. PO [44] and its descendents vpo [45] and gcc [46], lcc [47], MARION [35], SUIF [48] or Trimaran [49]. In these approaches, retargeting is mainly based on specifications that encapsulate machine-specific information required to drive the code selection. Assembly- or executable-based transformations are not supported.

Retargetable code generation and optimization systems for irregular architectures, mostly digital signal processors are RECORD [2], CBC [50], CHESS [51], Flexware [52], SPAM [53], or Express [40]. The hardware description mechanisms of these systems typically comprise more detailed information, normally in a mixed structural/behavioral way. However, they

do not support transformations on assembly- or executable code. Retargetable systems explicitly designed to work at assembly level are the SALTO system [36] and the PROPAN framework [3], [4].

## D. Postpass Optimizers

Compiler transformations are usually based on high-level program representations. In contrast, postpass optimizations operate on machine programs, i.e. assembly or object files [6]. An early postpass optimization system is the Portable Optimizer PO [44]. Squeeze++ [54] is a link-time binary rewriter for the Alpha architecture; Diablo [6] a retargetable framework for link-time optimizations. PROPAN [3], [4] is a retargetable postpass optimization framework for embedded processors supporting irregular hardware features which is based on search-based code optimization techniques. aiPop [55], [6] is a commercial assembly-based postpass optimizer. It is a retargetable framwork partially built on the PROPAN system and is available for the Infineon C16x / ST10 and HC08 processor families.

#### E. Program Analysis

A comprehensive survey of program analysis is given in [56]. Cousot and Cousot [57] describe a general framework for static program analyses called *abstract interpretation*. Based on the concepts of abstract interpretation, the PAG system [58] has been developed with automatically generates program anlyzers from an abstract specification of the analysis to be performed. In [59] a static cache analysis is presented which is a component in a framework to compute worst-case execution time guarantees for real-time systems [60] by static analyses.

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# **Full-System Simulation**

(Extended Abstract)
Jakob Engblom

Abstract—Full-System Simulation is a technology where the hardware of a computer system is simulated at such a level of detail that the complete real software stack can be executed. It has wide applicability in the development and research of computer systems, especially embedded systems. This talk gives an overview of the full-system simulation and some examples of its industrial and academic applications.

## I. INTRODUCTION

SIMULATION is a method of scientific and engineering inquiry that is based on the idea of building a *model* of a system, and then performing *experiments* on this model. Provided that the model has a good fidelity to the system being modeled, the results from the simulation experiments can be used to predict the behavior of the real system.

Simulation is used in all fields of science and engineering. For example, modern cars are virtually crash tested in computer simulation in order to build safer cars. Weather forecasts are prepared by simulating the evolution of current weather patterns into the future.

Computers can also be used to simulate computer systems. This introspective application of computers is incredibly useful, across all fields of computer hardware and software development, from initial architecture, through software development, to end-of-life maintenance.

A key concept is *full-system simulation*, meaning models that encompass *all* of a computer system. Including the processor core, its peripheral devices, memories, and network connections. With such technology, it is possible to simulate a whole computer system with its complete software stack, which opens up new possibilities in the field of computer-system simulation [1][2][3][4].

Full-system simulation has not been feasible until recently, thanks to two long-term technology trends. One is the fact that cheap PCs have become as fast as any other computer system; it used to be that in order to simulate a large server you needed a large server, but this is no longer the case [2]. The other trend is that simulation technology has improved the efficiency of simulation by orders of magnitude. The net result is that the simulation cost per hour of target time has come down by four orders of magnitude over the past 25 years [1]!

# II. FULL-SYSTEM SIMULATION

The idea behind full-system simulation is very simple:

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model the behavior of the hardware of a system at a sufficient level of detail that all the *real software* can run (Figure 1); at a level of abstraction appropriate to simulating complete systems containing multiple processors and machines, potentially connected across simulated networks.

## A. Scope and Abstraction

The size of the system (i.e. the scope) that can be simulated depends on the level of abstraction chosen in the model. The more detailed the model is, the smaller the simulated system has to be. For full-system simulation, the most appropriate abstraction is the instruction set and control register level. This level has the advantage of being the best documented and most stable layer in a system.

Working at this level makes it possible to simulate networks of *hundreds of simulated machines* using a few tens of host machines. Using a more detailed model, like the RTL level simulations common in hardware design, would decrease the simulation speed to an unusable level. Going to higher levels of abstraction, like operating system APIs, would lose too much information about the system to make it useful. Also, maintaining an API-level simulation is very expensive since it is a much broader and faster-changing interface compared to the instruction set level.

# B. Processor

In most cases, the most complex part of a computer system is the main processor core(s). Instruction processing also uses most of the execution time of the simulation, and thus, creating a fast model of the instruction set is key to good simulation performance. The current state of the art allows instruction set simulation to reach speeds in the hundreds of million of instructions per second, which is sufficient to execute large real-life workloads.

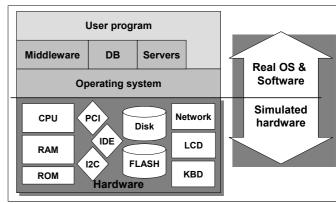


Fig. 1. Full-System Simulation is based on simulating the hardware while running all the real software of a system, with sufficient speed to execute real workloads.

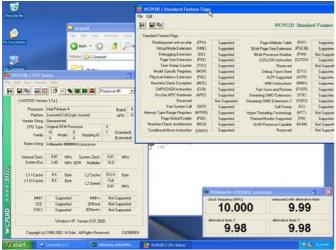


Fig. 2. This screenshot shows Virtutech Simics presenting all the model-specific registers of a Pentium 4 to the diagnostic program wcpuid. The clock frequency meter is THGClock, which measures the speed of the CPU clock using timers. This also gives a consistent result.

In order to run all the software of a system, the processor model must implement both the user-level and supervisor-level interfaces of the processors, as well as the memory-management unit and various low-level machine registers. Anything that can be seen from the software has to be modeled. Figure 2 gives an indication of the level of detail required when modeling processors of the x86 line.

Another important consideration is that the results of all instructions have to be bit-exact. A difference in computation results compared to a real machine is not acceptable.

For most systems, it is reasonable to use a fairly simplistic model of instruction timing, typically one cycle per instruction. If necessary, this model can be extended with more precise timing. For example, just adding the timing of the cache system provides a fairly useful timing model for most embedded systems, and computer architecture researchers will often create complete microarchitectural models of a processor. However, the more detail that is added, the slower the simulation will run.

#### C. Devices

The defining difference between full-system simulation and traditional instruction-set simulation is the modeling of devices. Device models are necessary in order to get meaningful software to run on the simulator. Timers, network interfaces, PCI bridges, SCSI interfaces, graphics devices, serial ports: there is a large number of different devices which are present in a computer system that must be modeled.

Device models can be either transaction-oriented or bit level. A *transaction-oriented* model handles each interaction (typically, a write to or read from the interface registers of the devices by a processor) to a device as a unit: the device is presented with a request, computes the reply, and returns it in a single function call. This is a very efficient model.

A *bit-level model* instead models the actual bit patterns traveling over buses and pins in the computer. Instead of a single transaction, each cycle on the bus is played out. The device model will read the address and data lines, wait for some cycles, and then put its reply on the bus connecting it to the CPU. This style of modeling results in much lower performance, since the simulation needs to switch context more

often, and more computation work is required for the same result.

Of course, it is possible to create hybrids between the two extremes. One quite common approach is to let most of a system work at the transaction level, modeling only a small part of the system at the bit level. This offers an efficient way to drive a detailed model of a device with real traffic from a full system. At the point where the transaction level and the bit level meet, special conversion code is inserted. The conversion is quite simple, since most of the information needed to create bit-level signals is contained in the transactions. Usually, only detailed timing needs to be added in the form of a clock signal.

One should note that transaction-oriented modeling is enabled by the trend towards more abstract and less timing-dependent device interfaces. As noted in [5], in the 1970s, software and hardware often depended on precise timing to function together. Thanks to the trend that processors, devices, and buses are developed separately, software interfaces to hardware are becoming more abstract, thus enabling efficient device modeling.

# D. Software

The key goal of full-system simulation is to let the simulator run all the real software of a system, from firmware and devices drivers, the operating system, to databases, middleware, and application programs. That the complete software stack is used in the simulation enables many exciting applications, as detailed in Section III.

Note that the user-level applications often can be executed on less complete simulators using API-level simulation of the operating system, but as workloads become more dependent on the operating system, such simulation will start to miss important effects [3].

# E. Stimuli

Given that a good model of the hardware exists, and that the software stack is available and runs on this model, we need to find a way to provide stimuli to the system. Good stimuli are crucial to obtaining sensible results from the simulation, results that are relevant in the real world.

In some cases, just executing the software is a sufficient source of stimuli. This is the case, for example, when porting operating systems. Just doing a boot of the system provides a good way to check the correct function of the software being investigated. No external input is needed in this process.

For interactive systems, the simulation can rely on mapping the simulated user interface devices (screens, keyboards, mice, touch screens, etc.) to real devices.

Models of networked systems can include full machine models of both sender and receivers, or they can be interfaced to real networks. Abstract load generators can also be employed to generate traffic without using full machines.

When it comes to executing benchmarks like SPEC or TPC in the simulation, we might get performance issues if a detailed microarchitectural model is used. Especially processor design and computer architecture research is problematic, since these tasks by nature require very detailed processor models to be used. In such cases, we can use sampled execution or scaled workloads in order to get

acceptable simulation times [2][3].

# III. HANDY FEATURES OF SIMULATION

Since simulation is "just software", it offers many advantages compared to a real machine:

- 1) *Configurability*. Any machine configuration can be used, unconstrained by available physical hardware.
- 2) *Controllability*. The execution of the simulation can be controlled arbitrarily, disturbed, stopped, and started.
- 3) *Determinism*. A simulation is completely deterministic [1] (provided it is properly programmed).
- 4) Globally synchronous. Multiple processors, multiple devices, multiple machines in a network: all can be stopped instantly in a simulation, and a global snapshot of the state inspected.
- 5) *Checkpointing*. The state of the simulation can be written to disk and restored in an instant.
- 6) Availability. Creating a new machine is just a matter of copying the setup. There is no need to procure hardware prototypes or development boards.
- Inspectability. The complete state of the simulated machine can be investigated without disturbing the execution.
- 8) *Sandboxing*. The simulation environment offers a perfect sandbox, out of which no code or data can escape unless explicitly allowed.

So we see that in many ways, simulation is really better than the real thing!

# IV. INDUSTRIAL USE OF FULL-SYSTEM SIMULATION

#### A. Computer Architecture

Detailed simulation of processors has been a mainstay of computer architecture research and development for the past few decades [3]. Mainstream use is still simulation of single processors with none or few peripheral devices. However, as computer systems become more complex, including multiple processors and sophisticated peripherals, the scope of simulation has to expand apace. Many interesting workloads (like transaction processing and web servers) also feature significant amounts of operating system interaction. Thus, full-system simulation is becoming increasingly important.

# B. Computer System Development

Full-system simulation is also used in the development of *computer systems*, not just components. By using full-system simulation, designers of complex computer systems such as servers, flight controllers, or network routers can build *virtual prototypes*. Virtual prototypes are used to model and analyze the system configuration, making it possible to create a more efficient overall system.

Furthermore, the virtual prototypes are used by software teams to get an early start on software development for the new system. As illustrated in Figure 3, the software teams can start working long before hardware is available (even in prototype form). This allows critical tasks like device driver and firmware development, and operating system bring-up to proceed in parallel with the hardware development, which can save many months of time to market for a moderately complex system. The need to program a computer before the

system is completed was foreseen already in 1946 by Alan Turing [6], so it is really an old need that can finally be satisfied in a reasonable way thanks to full-system simulation.

A good example of the value of virtual prototyping is AMD's AMD64 architecture. When the processors and systems were finally launched in hardware form in 2003, operating systems like Linux and Windows were already running on the processors. This was thanks to a seeding program using full-system simulation which had been going on since 2001, giving AMD a much broader software support at launch than would otherwise have been possible.

#### C. Hardware/Software Cosimulation

Full-system simulation is also used in cosimulation, where some part of a system (a device, a processor, or maybe a bus controller) is simulated in detail at the RTL level. By simulating as much as possible of the system at a higher level of abstraction, simulation speed is greatly increased compared to simulation of a whole system at the RTL level.

Note that the slowest simulated component of a system will determine the overall simulation speed. However, if the slowest component is clocked at a lower rate than other parts (like a 100 Mhz bus connected to 1000 Mhz processors), the impact can be minimized. Intelligent and minimalist choices of what to simulate in detail is crucial to obtaining good overall simulation performance.

With increased speed, bigger software runs can be made. Thanks to the completeness of the simulated systems, co-simulation can include the effects of operating systems. Overall, this means that more realistic simulations can be performed, which increases the value of the co-simulation.

# D. Network Research and Development

By allowing real operating systems and workloads to run on the simulated machines, full-system simulation opens up new vistas of network research. Today, most network simulations focus on the behavior of the network, while modeling the network nodes as simple synthetic traffic generators. Using full-system simulation, it is possible to replace synthetic traffic with real traffic. To model a client-server scenario, both the client and server machines are simulated, and real interactive sessions played out between them. This makes it possible to investigate the interaction between applications, servers, and the network. And all parts of the equation can be changed arbitrarily. The effect of optimizations to network stacks, device drivers, and actual network interface hardware can be investigated in detail in a simulated environment.

Networks in simulation are also much easier to trace and inspect than real networks. Every packet sent is available for inspection, without affecting the functionality of the system. Disturbances and faults can be injected into a system with ease and precision, since there is no need to actually disturb physical links.

An interesting special case is the testing of large network configurations. In most cases, building a very large test network is prohibitively expensive. Here, full-system simulation allows hundreds of network nodes to be simulated using a handful of standard PCs or server machines. This

leads to very large cost savings, as well as an increase in product quality and developer productivity thanks to better testing, easier setup and reconfiguration, and troubleshooting abilities.

# E. Software Development

Simulators are being used in software development, for a number of different purposes. As discussed above, virtual prototypes are used to develop low-level software for new systems. Once the hardware is stable and no longer in the prototype stage, the simulation model really becomes *virtual hardware*. Such virtual hardware behaves identically to the real hardware, and is used as hardware replacements.

By making the hardware virtual, replication of the hardware becomes easy and very cheap. This means that more developers can be given direct access to the hardware in question, without the expense of buying or manufacturing extra target systems. Especially for expensive custom hardware systems, this gives great savings.

Virtual hardware comes with all the benefits of simulation: by using the checkpointing, determinism, and inspection abilities, software bugs are easier to repeat and fix.

For low-level software like interrupt handlers and operating systems, simulation offers a superior debugging environment. Hardware accesses can be accurately traced, the state of components, like configuration registers and processor TLBs can be inspected, and interrupt handlers can be single-stepped. All of which is impossible on a real machine.

# F. Fault Injection

Simulation affords the user complete control over the simulated system, which makes fault-injection testing very effective and efficient. Thanks to the controllability, faults can be injected at any point in a system: processor register, device registers, memory contents, bus traffic, network packets: everything is available for transient or permanent modification. Thanks to the control over timing, injected faults can be precisely repeated, which allows for regression testing in the presence of faults.

#### G. Legacy System Support

Long-lived computer systems used in commercial and aerospace applications have a tendency to far outlive the commercial lifespan of their components. This creates problems for the developers maintaining the software base:

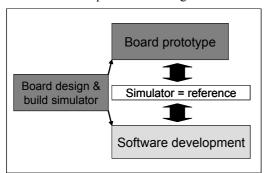


Fig. 3. Parallelization of software and hardware development using full-system simulation. The simulator is designed as part of the system design, and handed over to the software team at the same time as the hardware group starts building the hardware prototypes. This methodology can save many months of time to market for complex computer systems.

development boards will break, and replacements will be impossible to buy. To solve this problem, full-system simulation is used to create virtual development boards with a far greater lifespan than the hardware. A virtual model can easily be ported to run on successive generations of development workstations, irrespective of the hardware availability of the actual target systems.

#### V. Summary

This extended abstract has given a quick overview of full-systems simulation technology, the ideas behind it, and its industrial and academic application areas. Full-system simulation is an old idea whose time has finally come, thanks to the prevalence of cheap and powerful computers, and a maturation of the technology.

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# Communications and Networking in Embedded Systems

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Abstract—This tutorial discusses Linux/SimOS as a platform for simulating embedded system. Linux/SimOS is a Linux operating system port to a complete machine simulator SimOS. We demonstrate how Linux/SimOS is capable of capturing all aspects of communication performance of embedded systems that includes the effects of the kernel, device driver, and network interface. These results will help understand how the protocols work, identify key areas of interests, and suggest possible opportunities for improvement not only in the protocol stack but also in terms of hardware support. Based on this, we also explore one possible solution, called cache coherence-based data transfer, to improve the data transfer time between the host memory and network interface. The second part of the tutorial discusses wireless networking requirements for embedded systems. In particular, we focus on medium access control for wireless LANs and mobile ad hoc networks.

Index Terms—High-speed communication, network interface, network protocol, complete system simulation, mobile ad-hoc networks, medium access control.

# I. INTRODUCTION

oday's communication systems are complex embedded Whether they are high-speed network interfaces connected to a system area network or smart nodes in a sensor network, these devices typically contain a microprocessor and a network interface and communicate with other embedded devices or to larger networks. Detailed performance analysis of a communication system is often difficult because it is dependent not only on the processor speed but also on the communication protocol and its interaction with the kernel, device driver, network interface, and the communication medium. Therefore, these interactions must be properly captured to understand how the protocols work, identify key areas of interests, and suggest possible opportunities for improvement not only in the protocol stack but also in terms of hardware support.

The area of communications and networking for embedded system is very broad in scope. However, this tutorial concentrates on the critical path of communication, mainly transport layer to link layer functionalities to understand and evaluate the software and hardware interactions that affect the communication performance of embedded systems. In particular, we show how *Linux/SimOS* [12], which is a Linux operating system port to a complete machine simulator SimOS [3], can be used as an extremely

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effective and flexible open-source simulation environment for studying all aspects of embedded systems performance, especially evaluating communication protocols and network Such a study will help understand how communications work, identify key areas of interests, and suggest possible opportunities for improvement not only in the protocol stack but also in terms of hardware support. Based on the analysis using Linux/SimOS, we will also explore one possible solution, called cache coherence-based data transfer, to improve the communication performance. Finally, wireless networking is becoming increasingly important to embedded systems as market needs drive devices towards increased connectivity with higher bandwidth. Therefore, we will discuss various medium access control (MAC) techniques for wireless networks, in particular mobile ad hoc networks (MANETs).

#### II. LINUX/SIMOS

# A. Linux/SimOS Interface

Figure 1 shows the structure of Linux/SimOS. An x86-based Linux machine serves as the host for running the simulation environment. SimOS runs as a target machine on the host, which consists of simulated models of CPU, memory, timer, and various I/O devices (such as Disk, Console, and Ethernet NIC). On top of the target machine, Linux kernel version 2.3 for MIPS runs as the target operating system.

SimOS [3] supports two execution-driven, cycle-accurate CPU models: Mipsy and MSX. Mipsy models a simple pipeline similar to MIPS R4000, while MSX models a superscalar, dynamically scheduled pipeline similar to MIPS R10000. The CPU models support the execution of the MIPS instruction set. SimOS also models the behavior of I/O devices by performing DMA operations to/from the memory and interrupting the CPU when I/O requests complete.

SimOS provides several I/O device models, which includes console, SCSI disk, Ethernet NIC, and a timer. These devices provide the interface between the simulator and the real world. The console model allows a user to read messages from and type in commands into the simulated machine's console. The SimOS NIC model enables a simulated machine to communicate with other simulated machines or real machines through the Ethernet. By allocating an IP address for the simulated machine, it can act as an Internet node, such as a Web browser or a Web server. SimOS uses the host machine's file system to provide the functionality of a hard disk, maintaining the disk's contents in a file on the host machine. Reads and writes to the

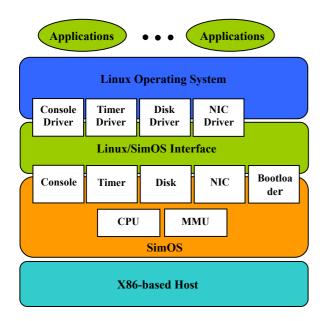


Fig 1. The Structure of Linux/SimOS.

simulated disk become reads and writes to this file, and DMA transfers require simply copying data from the file into the portion of the simulator's address space representing the target machine's main memory.

Most of the major modifications that were necessary to port Linux to SimOS were done on the I/O device drivers for Linux. These include timer, console, SCSI disk, kernel bootloader, Ethernet NIC, and EtherSim, which is used to perform network simulation.

# B. Simulation Study of UDP/IP and M-VIA

In order to demonstrate the capabilities of Linux/SimOS, the performance analysis of UDP/IP and M-VIA [5] was performed. The CPU model employed was Mipsy with 32 Kbyte L1 instruction and data caches with 1 cycle hit latency, and 1 Mbyte L2 cache with 10 cycle hit latency. The main memory was configured to have 32 Mbyte with hit latency of 100 cycles, and DMA on the Ethernet NIC model was set to have a transfer rate of 240 Mbytes/sec. The results were obtained using SimOS's data collection mechanism, which uses a set of annotation routines written in Tcl [3].

The UDP/IP performance was evaluated by directly sending messages through the legacy protocol stack in Linux/SimOS. For M-VIA, some modifications were necessary to the source code and the driver to make it compatible with the MIPS-based processor model and the Ethernet NIC of Linux/SimOS.

The performance study focused on the latency (in cycles) to perform send/receive. These simulations were run with a fixed MTU size of 1,500 bytes with varying message sizes. The total cycle times required to perform send as a function of message size are shown in Figure 2, where each message size has a pair of bar graphs for M-VIA (left) and UDP/IP (right). For sake of brevity, only the send results are shown. These results represent only the latency measurement of major operations directly related to sending messages and do not include the time needed to set up socket communication for UDP/IP and memory region registration for M-VIA. These results also do not include the effects of MAC and

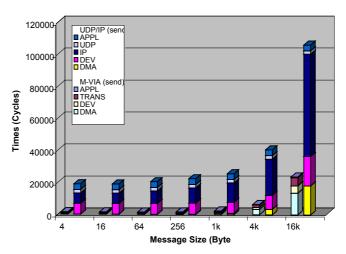


Fig 2. Send Latency

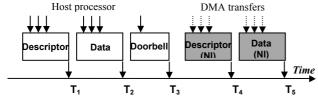
physical layer operations.

The results in Figure 2 clearly show the advantage of using low-latency, user-level messaging, especially for small messages. For message sizes less than the MTU size, the improvement factors for M-VIA send latencies over UDP/IP are 11~14.1. For message sizes greater than the MTU size, the improvement factors for M-VIA send latencies over UDP/IP are 4.2~6.3.

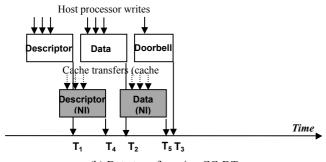
Figure 2 also show the latencies for the various layers available for each protocol. This allows us to observe how much time is spent at each layer of the protocol and how each layer contributes to the final result. The latencies for UDP/IP were broken into layers associated with APPL, UDP, IP, DEV, and DMA. APPL includes the time required to initiate send and receive and perform socket operations. UDP and IP are times for executing UDP and IP protocols, respectively. DEV represents the device driver and includes all the operations between IP and host-side DMA, including DMA interrupt handling. Finally, DMA represents the time to DMA data between host memory and NIC buffers.

Similarly, the latencies for M-VIA were broken into layers associated with APPL, TRANS, DEV, and DMA. APPL represents the time required to initiate VI provider library functions, VipPostSend() [6]. This involves creating a descriptor in the registered memory and then adding the descriptor to the send/receive queue. The transport layer then performs virtual-to-physical/physical-to-virtual address translation and fragmentation/de-fragmentation. Therefore, TRANS represents the time spent on the transport layer, but also includes part of the device driver, mainly DMA setup. Again, DMA represents the time to DMA data between host memory and NIC buffers.

For UDP/IP send shown in Figure 2, APPL and UDP remain relatively constant. However, IP and DEV dominate as the message size grows. In particular, IP layer increases significantly as a function of messages size. This is because IP handles both packet fragmentation and data copying from user space to socket buffer. Therefore, IP portion increases substantially for messages greater than the MTU size. In addition, DMA also takes a significant portion of the latency for message size over 4 Kbytes. For M-VIA send, latencies are relatively evenly spread among APPL, TRANS, and DEV for message size up to 1 Kbyte. However, as message size increases beyond 1 Kbytes, DMA takes up most of the latency



(a) Data transfer using DMA.



(b) Data transfer using CC-DT.

Fig 3. DMA vs. CC-DT.

and increases rapidly. TRANS and DEV also increase significantly for message sizes larger than 1 Kbytes due to fragmentation and interrupt handling, respectively.

For DEV and DMA layers, both UDP/IP and M-VIA protocols show similar results. This is because M-VIA uses a same type of device driver to communicate with the Ethernet NIC model. The primary function of the DEV layer is to set up NIC's DMA and receive interrupts from NIC. As can be seen, the latency of DEV remains relatively constant for message size up to 1 K bytes, but increases significantly when the messages are larger than the MTU size. DMA also varies linearly with the message size. This is consistent since DMA initiation and interrupt handling are already reflected in the DEV layer; therefore, DMA transfer time is dependent only on the message size.

# C. Reducing Communication Latency

Based on the aforementioned analysis of communication protocols, it is obvious that the data transfer time between the host memory and network interface constitutes a significant portion of the overall communication latency. Therefore, this section explores a new data transfer mechanism to reduce this performance gap. The approach called Cache-Coherent Data Transfer (CC-DT) [13] is a special hardware structure that efficiently transfers data between the host and NI using the underlying cache coherence protocol. The CC-DT mechanism improves the performance by performing data transfer completely in hardware. Therefore, unlike DMA or CNI [10], there is no additional software overhead involved in data transfer and the memory bus bandwidth is efficiently efficient used since data transfers are done in cache block units. The proposed CC-DT together with an off-kernel VIA, called SonicVIA, was modeled and implemented as a NI module on Linux/SimOS. This allows us to capture all aspects of the communication performance, including the effects of the application, network protocol, and network

Figure 3 illustrates the critical difference between a normal DMA transfer and CC-DT. As can be seen, there is a time interval between when the user process writes data to the user buffer  $(T_2)$  and when data is DMA from the user buffer to NI

buffer  $(T_5)$ . Since this time accounts for a significant portion of the overall latency, the primary motivation of CC-DT is to overlap the execution of the user data writes and the DMA transfer of data to NI buffer to reduce the overall latency for message send/receive. CC-DT efficiently transfers data between the user buffer in the registered memory region and NI buffer allocated in NI local memory. This is accomplished by a special cache controller in NI that detects any accesses to the registered memory region, and maintains data coherence between the two associated buffers (see [13] for details).

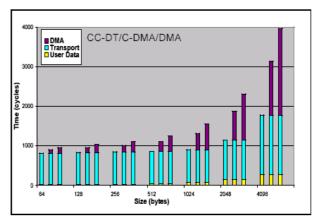


Figure 4: Breakdown of send+receive.

The total execution times required to perform a send+receive between two users as function of message size is shown in Figure 4. For each message size, there are three bar graphs representing the execution times of CC-DT (left), C-DMA (middle), and DMA (right). As can be see in the figure, the CC-DT mechanism results in much better performance compared to DMA and C-DMA [11]. The CC-DT-based NI attains 9% to 43 % reduction in the user-to-user messaging latency compared to the C-DMA-based NI. More importantly, the performance improvement becomes more significant as message size increases.

In order to gain a better understanding of the performance improvement, Figure 4 also shows the total execution times subdivided into three most significant sections in user-to-user communication: User Data, DMA, and Transport. The User Data section is the time required for the user program to write a message to the user buffer. The DMA section includes the time for DMA setup, DMA operations, and handling interrupts after DMA operations complete. The Transport section represents the time required to run the network protocol to service the user send/receive requests.

The breakdown view of the total execution time in Figure 4 clearly shows how significantly each section affects the overall latency and increases as data size grows. In particular, the amount of time spent on the DMA section depends on the underlying data transfer mechanism. The DMA sections for C-DMA are smaller than the ones for DMA. This is because C-DMA engines support cache-to-cache transfer so that the user data and descriptor can be moved directly from the cache memory on host processor. In contrast, DMA engines require two steps to move the user data from the cache memory: The user data in the cache memory has to be first flushed to the host memory and then moved to the NI buffer. Notice that there is no DMA section for CC-DT because the

user data is transferred at the same time the user application writes to the user buffer. The User Data section increase with the message size, but are the same for all the data transfer mechanisms. As the message size increases beyond the MTU size, the Transport sections start to grow. This is due to the fact that the network protocol performs fragmentation and de-fragmentation. Again, the Transport sections do not vary with the underlying data transfer mechanism because all three methods were implemented on a common platform, i.e., SONIC-VIA. These results clearly show that the CC-DT approach significantly reduce the communication latency virtually eliminating the entire DMA section.

#### III MAC MECHANISMS FOR MANETS

Mobile devices coupled with wireless network interfaces will become an essential part of future computing environment. However, wireless LAN and mobile ad hoc networks (MANETs) suffer from collisions and interference due to the broadcast nature of radio communication and thus require special medium access control (MAC) protocols. These protocols employ control packets to avoid such collisions but the control packets themselves and packet retransmissions due to collisions reduce the available channel bandwidth for successful packet transmissions. At one extreme, aggressive collision control schemes can eliminate the retransmission overhead but at the cost of large control overhead. At the other extreme, the lack of control over collisions offers zero control overhead but it may need to expense large amount of channel bandwidth for retransmissions. Therefore, this section highlights various mechanisms that balance the abovementioned two overheads to enhance the channel utilization in the presence of increased chance of collisions.

MAC mechanisms can be broadly classified as *temporal* and *spatial* approaches depending on their focus of optimization on the channel bandwidth. The temporal approaches attempt to better utilize the channel along the time dimension, while the spatial approaches try to find more chances of spatial reuse without significantly increasing the chance of collisions.

Temporal techniques consist of:

- Optimizing *Distributed Coordination Function* (DCF) parameters, such as when RTS/CTS should be used as function of message size or collision probability.
- Improving the backoff algorithm by (1) properly adjusting the contention window (CW) size to reduce collisions, (2) different treatment of new and lost nodes for fairness, and (3) dynamic tuning of CW to minimize collision probability.

Spatial techniques consist of:

- Use of busy tones on separate channels to solve the exposed terminal problem and the hidden node problem due to mobility.
- Transmission power control to reduce interference range radially
- Directional antenna to reduce interference range angularly.

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# System-Level Optimization based on Genetic Algorithms

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Abstract—Genetic algorithms have been the subject of numerous investigations in the last decades, and they have been proven to solve different search and optimization problems successfully. By imitating and applying the principles of natural selection, they are able to evolve solutions to real-world problems. One of these real-world problems is the automated design of embedded computing systems.

In this extended abstract, we will first briefly discuss the general theory of genetic algorithms and then demonstrate their applicability in the context of system-level design. In particular two hard optimization problems are addressed: activity scheduling and application mapping of heterogeneous distributed systems. Particularly, we will focus on multi-mode systems that contain dynamically voltage-scalable processing elements. The optimizations are carried out towards the fulfillment of multiple design objectives, such as timing behavior, area requirements, and power consumption.

#### I. INTRODUCTION

The complexity of embedded systems has increased dramatically over the last decades. While initial systems offered restricted functionality that could be realized through "simple" application-specific circuitry (e.g., pocket calculators, digital watches, etc.), nowadays portable computing systems have to provide workstation-like performance at low energy consumption in order to carried out computational-expensive multimedia applications over long battery-life times (for example, portable DVD players, MP3 players, cellular phones, PDAs, and so on). Along with the increasing complexity comes a tense market pressure that has resulted in shrinking product life cycles and shortening time-to-market windows. Both trends, the increasing complexity to due feature richness and the shortening time-to-market times, have resulted in the need for sophisticated design automation tools. Automating the systemlevel design of embedded computing systems is a difficult task that requires solving several subproblems, such as component allocation, multi-processor scheduling, and application mapping. Since some of these problems belong to the class of NP-hard problems, optimal solution often can not be obtained for realistic problem instances. Therefore, effective heuristic techniques are essential to yield good (not necessarily optimal) synthesis results in relatively short optimization times. One general heuristic optimization technique, which can be used for a wide range of different problems, is given by the class of genetic algorithms (GAs).

In this paper, we will briefly outline how genetic algorithms can be used for system-level synthesis, considering, in particular, architectures that contain dynamic voltage-scalable components.

#### II. BRIEF INTRODUCTION TO GENETIC ALGORITHMS

Before going into details of the genetic algorithm-based system-level synthesis technique, we will first introduce some fundamental knowledge regarding genetic algorithms and their functionality.

Genetic algorithms have been first introduced by Holland [5]. By imitating the principles of natural selection and evolution on a population of solution candidates, they are able to optimize solutions to real-world problems. Each solution candidate (individual) of the problem to be solved is represented as a string (chromosome). Each solution is further associated with a fitness which represents the solution quality. Based on this fitness, the individual solutions are ranked. Within each iteration (generation), the algorithm performs a probabilistic selection upon the ranked individuals (the higher the rank, the higher the chance of being selected) and gives them the opportunity to reproduce by means of mating (crossover) with other individuals of the population pool. This reproduction results in new individuals (offsprings) that inherit certain properties and features from the parent individuals, thus increasing the probability to have higher solution quality. The produced offsprings replace individuals of lower fitness, which die out. Nevertheless, new individuals are not only produced through crossover operations, but also by randomly changing (mutation) genes of chromosomes, occasionally. This provides an additional possibility to enter unexplored regions in the search space. The GA evolves until a certain stop criterion is fulfilled. For example, a maximum number of generations have been excepted or improved individuals have not been food over a certain amount of generations, and so on. Fig. 1 shows this functionality of genetic algorithms in graphical form. For further readings, the interested reader is referred to excellent textbooks on this subject [2], [6].

# III. SYSTEM-LEVEL SYNTHESIS

Modern embedded systems are often implemented as heterogeneous, distributed architectures. The required

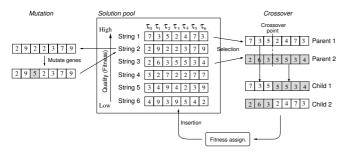


Fig. 1. Principles of genetic algorithm

functionality is implemented via software that runs on programmable components (e.g., general-purpose processors and DSPs) and via hardware (e.g., ASICs and FPGAs). Two important problems that need to be solved during the system-level synthesis are mapping and scheduling:

**Application mapping:** Functional fragments (tasks) of the system specification have to be uniquely assigned to the individual components of the architecture. Furthermore, communications between tasks mapped to different components need to be assigned to communication links.

**Activity scheduling:** An execution order and the exact start times of tasks and communications have to obtained, considering task interdependencies.

Certainly, the optimization of these two problems has to be performed towards multiple objectives which are possibility competing. These objectives include energy dissipation, timing behavior (fulfillment of deadlines), and area/memory requirements. For instance, executing a certain function in software is often less energy-efficient and more time consuming than implementing the same task in hardware. The purpose of the genetic algorithm-based synthesis approach presented in Section V is to solve these problems efficiently.

#### IV. PRELIMINARIES

In this section, we outline the used specification models and formulate the problem at hand.

# A. System Specification

The abstract specification model we consider here is based on a combination of finite state machines and task graphs, used to capture the interaction between different operational modes as well as the functionality of each individual mode. We refer to this model as operational mode state machine (OMSM). The following section explains this model, using the smart phone example shown in Fig. 2. This smart phone combines three different functionalities within one device: a GSM phone, a digital camera, and an MP3-player.

1) Top-level Finite State Machine: We consider that an application is given as a directed, cyclic graph  $\Upsilon(\Omega,\Theta)$ , which represents a finite state machine. Within this top-level model, each node  $O \in \Omega$  refers to an operational mode and each edge  $T \in \Theta$  specifies a transition between two modes. If the system undergoes a change from mode  $O_x$  to mode  $O_y$ , with  $x \neq y$ , the transition time  $t_T^{max}$  associated with the

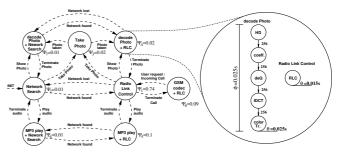


Fig. 2. Operational mode state machine and individual task graph specifica-

transition edge  $T = (O_x, O_y)$  has to be met. At any given time there is only one active mode, i.e., the modes are mutually exclusive. Fig. 2(a) exemplifies the operational mode state machine for a smart phone example with eight different modes. An activation scenario could look like this: When switched on, the phone initializes into Network Search mode. Upon finding a network, the phone changes into Radio Link Control (RLC) mode. In this mode it maintains the connection to the network by handling cell handovers, radio link failure responses, and adaptive RF power control. An incoming phone call necessitates to switch into GSM codec + RLC mode. This mode is responsible for speech encoding and decoding while maintaining network connectivity. Similarly, the remaining modes have different functions and are activated upon mode change events. Such events originate upon user requests (e.g. MP3-player activation) or are initiated by the system itself (e.g. loss of network–switch back into network search mode).

Based on the observation that many multi-mode systems spend their operational time *not evenly* in each of the modes, we assume that for each operational mode O its execution probability  $\Psi_O$  is given, i.e., we know what percentage of the operational time the device spends in each mode. For instance, in accordance to Fig. 2(a), the smart phone stays 74% of this operational time in Radio Link Control (RLC) mode, 9% in GSM codec + RLC mode, and 1% in Network Search mode. The left over 16% of the operation time are associated with the remaining modes.

2) Functional Specification of Individual Modes: The functional specification of each mode  $O \in \Omega$  in the top-level finite state machine is expressed by a task graph  $G_S^O(\mathcal{T}, \mathcal{C})$ ; see Fig. 2(b). Here, each node  $\tau \in \mathcal{T}$  represents a task, an atomic unit of functionality that needs to be executed without preemption. We consider a coarse level of granularity where tasks refer to functions such as Huffman decoders, dequantizers, FFTs, IDCTs, etc. Therefore, each task is further associated with a task type  $\eta \in \Gamma^O$ . A distinctive feature of multi-mode systems is that task type sets  $\Gamma^O$  of different modes  $O \in \Omega$  can intersect, i.e., tasks of identical type can share the same hardware resource. Of course, resource sharing is also possible for multiple tasks of identical type which are found in a single mode, however, due to task communalities among different modes the chances to share resources are increased. Edges  $\gamma \in \mathcal{C}$  in the task graph refer to precedence constraints and data dependencies between the computational tasks, i.e., if two tasks,  $\tau_i$  and  $\tau_j$ , are connected by an edge, then task  $\tau_i$  must have finished and transfered its data to task  $\tau_j$ , before  $\tau_j$  can be executed. A feasible implementation needs to obey all timing constraints and precedence relations.

#### B. Architectural Model

Our system-level synthesis approach targets distributed architectures that possibly consist of several heterogeneous processing elements (PEs), such as general purpose processors (GPPs), ASIPs, ASICs, and FPGAs. These components are connected through an infrastructure of communication links (CLs). Since each task might have multiple implementation alternatives, it can be potentially mapped onto several different PEs that are capable to perform this type of task. However, if a task is mapped to a hardware component, i.e., ASIC or FPGA, a core for this task type needs to be allocated, involving the usage of area. Tasks assigned to GPPs or ASIPs (software tasks) need to be sequentialized whilst the tasks mapped onto FPGAs and ASICs (hardware tasks) can be performed in parallel if the necessary resources (cores) are not already engaged. However, contention between two or more tasks assigned to the same hardware core necessitates a sequential execution order, similar to software tasks.

Further, PEs might feature dynamic voltage scaling to enable a tradeoff between power consumption and performance which can be exploited during run-time. For such PEs a voltage schedule needs to be derived, additionally to a timing schedule [4], [7]. To implement a multi-mode application captured as OMSM, the tasks and communications of all operational modes need to be mapped onto the architecture, and a valid *schedule* for these activities  $\epsilon \in (\mathcal{A} = \mathcal{T} \cup \mathcal{C})$ needs to be constructed. Further, for tasks mapped to DVS enabled components an energy reducing voltage schedule has to be determined. Hence, an implementation candidate can be expressed through four functions which need to be derived for each operational mode  $O \in \Omega$ :  $M_{\tau}^{O} : \mathcal{T} \to \pi$ ,  $M_{\gamma}^{O} : \mathcal{C} \to \lambda$ ,  $S_{\epsilon}^O: \mathcal{A} \to \mathbb{R}_0^+$ , and  $V_{\tau}^O: \mathcal{T}_{DVS} \to \mathcal{V}_{\pi}$ , where  $M_{\tau}^O$  and  $M_{\sim}^{O}$  denote task and communication mapping, respectively. Activity start times are specified by the scheduling function  $S_{\epsilon}^{O}$ , while  $V_{\tau}^{O}$  defines the voltage schedule for all tasks  $\tau \in \mathcal{T}_{DVS}$  mapped to DVS-PEs, where  $\mathcal{V}_{\pi}$  is the set of the possible discrete supply voltages of PE  $\pi$ . Clearly, the mappings as well as the corresponding schedules are defined for every mode separately, i.e., during the change from mode  $O_x$  to mode  $O_y$ , the execution of activities found in mode  $O_x$ are finished, and the activities of mode  $O_y$  are activated.

#### V. System-Level Synthesis based on GAs

In this section, a *two-step* synthesis approach is introduced. We will first outline an activity scheduling technique, which is then combined with communication mapping. This is followed by a multi-mode task mapping approach.

#### A. Activity Scheduling

In heterogeneous multiprocessor architectures that contain voltage-scalable components, the execution order of tasks and communications has not only an influence on the timing behavior but also on the energy-efficiency of the system.

The scheduling technique described here is based on genetic list scheduling approaches [3], which combine fast constructive list scheduling with the optimization power of genetic algorithms. Classical list scheduling techniques build an execution order step-by-step. This is done by maintaining a list of tasks that are ready to execute, and in each step the task with the highest priority value will be selected for execution. After such a task has been scheduled, the ready list will be updated by removing the scheduled task and adding new tasks that have become ready. The critical issue of list scheduling approaches is hence the assignment of priorities to the tasks that will lead to a good scheduling solution. Many sophisticated algorithms for this purpose have been proposed [1]. Nevertheless, genetic list scheduling goes a different way. Instead of building one schedule using a single priority assignment, they construct and evaluate several schedules by assigning priorities that are subject to optimization. This is achieved by encoding the priorities into a priority string, as shown in Fig. 3.

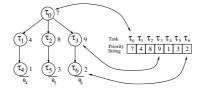


Fig. 3. Priority string

The goal of the genetic algorithm is then to evolve a priority string that leads to a schedule that satisfies the imposed deadlines and minimizes the energy consumption.

# B. Combined Scheduling and Communication Mapping

For communication intensive applications, data transmissions have to be mapped adequately onto the available communication links, due to their impact on the overall system performance and energy dissipation. One important decision that we have taken in this regard, was the separation of communication mapping from the task mapping. The example given in Fig. 4 highlights the reason behind this decision. As we can observe, simply combining the task and communication mapping with a single mapping string that will be optimized by a GA is likely to produce infeasible offspring. For instance, the mapping string in Fig. 4(b) represents a valid assignment of tasks and communication to the components. However, performing a crossover with a second string might result in the string of Fig. 4(c), in which the task mapping of tasks  $\tau_1$  and  $\tau_2$ has been changed. Nevertheless, this task mapping renders the communication mapping impossible: the communication

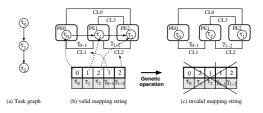


Fig. 4. Combined optimization of task and communication mapping

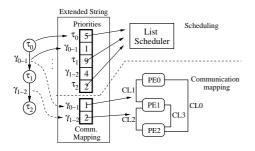


Fig. 5. Combined string for communication mapping and scheduling

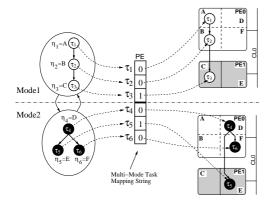


Fig. 6. Multi-mode task mapping string

between tasks  $\tau_0$  (PE0) and  $\tau_1$  (PE2) is assigned to link CL1; however CL1 does not connect PE0 and PE2.

To overcome this problem, a combined scheduling and communication mapping string is introduce, as given in Fig. 5. We can see that this representation consists of two parts: a) the priorities for tasks and communications and b) the communication mapping. Using this string it becomes possible to use a genetic algorithm to simultaneously optimize the execution order as well as the communication mapping. Of course, in multi-mode systems this combined optimization has to be performed on the tasks and communications of each mode, in order to yield valid schedules and communication mappings.

#### C. Multi-Mode Task Mapping

Moving a step higher in the optimization hierarchy, it is necessary to assign the tasks of the system specification to the individual processing elements in the system. We employ the following task mapping string to enable the optimization through a genetic algorithm. Fig. 6 shows the task mapping string for multi-mode systems. As we can observe, this mapping string is subdivided into mapping strings, each corresponding to the tasks of an operational mode (two in the figure). Each gene in the strings assigns uniquely a task to a processing element. Needless to say, only after a task mapping has been established, the combined communication mapping and scheduling optimization can be carried out. Therefore, during the optimization run of the task mapping it is necessary to run the optimization of the scheduling and communication

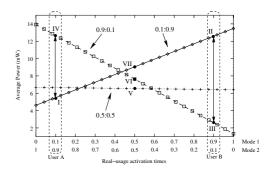


Fig. 7. Execution probability influence on the energy efficiency

mapping, in order to evaluate the evolving task mappings.

#### VI. SYNTHESIS RESULTS

The presented synthesis techniques have been extensively tested using several generated benchmarks as well as a realistic smart-phone specification [8]. However, in the following we restrict ourselves to outline solely the influence of mode execution probabilities on the energy-efficiency of the system. Fig. 7 shows the average power consumption of a two mode systems over different activation times. The three lines correspond to three different optimization runs for certain execution probabilities. As expected, it is important that the real-usage of the devices is close to the execution probability that has been used during the optimization.

#### VII. CONCLUSION

We have outlined in this extended abstract how genetic algorithms can be applied to system-level synthesis. In particular, we have concentrated on task and communication mapping as well as on scheduling techniques. One main advantage of using generalized optimization techniques for the synthesis is their easy extensibility towards multiple design objectives.

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# Predictability of Real-Time Software on Commodity Platforms

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#### I. BACKGROUND

This lecture focuses on means to make real-time applications predictable when they run on general-purpose operating systems. The past two decades have ushered in tremendous advances in real-time technology. Today, there are well-founded architectural principles, design guidelines and best implementation practices for most real-time applications. All modern operating systems provide sufficient real-time support, including means for static configuration of real-time components on multiple processors, non-paged memory for time-critical code and data, prioritization of activities based on their required response times, end-to-end priority tracking across layers and components, prioritized access to resources, and some form of priority inversion control. There are also methods and tools with which a developer can determine with acceptable accuracy worst-case execution times of time-critical components and validate rigorously the schedulability of the components and the system as a whole. These advances have enabled event-driven time-critical applications to be as provable responsive as timedriven applications. The lecture starts by reviewing these results; further details can be found in the incomplete list of general references [1-5].

The second part of this lecture discusses the gaps between many assumptions of real-time workload and system models and real-life applications and platforms. The gaps are often wide and unbridgeable. An example is the common assumptions underlying many studies on multiprocessor scheduling: Jobs (threads) can be dispatched dynamically from a common priority queue for all processors, and a newly ready higher priority job preempts the lowest priority job in the system. For the sake of scalability and performance, modern operating systems use a queue per processor. Because preempting the lowest priority job in the system as a rule can lead to high cache misses and cascaded context swaps, the kernel makes no attempt to locate and preempt the lowest priority job when dispatching a higher priority job. It is difficult to implement algorithms based on an invalid system model. Moreover, the gain in schedulable utilization through dynamic dispatching is likely to be offset by loss in effective utilization due to higher overhead.

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#### II. OPEN SYSTEM AND RESOURCE RESERVATION

The third part of this lecture talks about state-of-art supports for real-time applications on open platforms. A common assumption underlying existing real-time techniques and standards is that the system is closed. This assumption is by and large valid until recently. In the past, embedded and real-time applications, ranging from avionics and flight management, medical instrumentation, process control, intelligent manufacturing, and C3I, ran exclusively on dedicated, closed platforms. Resource demands and real-time requirements of all applications in the system are known. This knowledge makes it possible to control their resource contentions coherently and to predict their timing behavior accurately.

In recent years, rapid growth in diversity and pervasiveness of embedded and real-time applications has increased the pressure on reducing their costs and has shortened the time for their deployment and upgrade. A consequence is the growing trend to build such applications from components and run them on open platforms. The open-system approach has many advantages: Widely available tools and building blocks can significantly lower development and deployment cost and time; hardware and kernel abstractions enable the use of a wider variety of devices and configurations; and the burden of keeping pace with advances in hardware and software technologies is off-loaded to platform developers.

An open environment contains independently developed system and application components. The lack of information on their resource demands and inability to control their behavior make it impossible to ensure predictability of time-critical components in open systems without some form of reservation.

Resource reservation was first proposed by C. Mercer as a way to ensure the quality of services of multimedia applications [6]. Subsequently, the concept has been refined and extended to support real-time guarantees (e.g., [7-9]) and resource sharing (e.g., [10].) Several experimental and commercial prototypes (e.g., [7, 11, and 12]) have demonstrated that resource reservation is feasible and effective. By providing each time-critical component with timing isolation and protecting it from ill effects of resource contention, resource reservation makes it possible to test, verify and tune the timing behavior of the component without regard to how other components in the system are scheduled.

#### III. PROCESSOR TIME GUARANTEE

By far, processor reservation is the most mature compared with reservation mechanisms for other types of time-shared resources. A *processor reserve* is a fractional bandwidth of a processor. When there is a reserve (P, B) with *period* P and *budget* B (B < P) on a processor, the system commits to deliver B units of time of that processor to the reserve every period. Thus, the reserve is guaranteed the fraction B/P of the processor bandwidth. Since the budget of each period is delivered by the end of the period, the period P is its latency guarantee. Once admitted and created, threads (and processes) can be put in the reserve, meaning that they share the processor time allocated to the reserve.

There are many ways to support processor reserves. A common alternative is to put processor reserves in middleware and user levels. This is the approach taken by Resource Kernels, RK/NT and Linux/RT [11] and by Aurema resource manager [12]. Portability is a major advantage of this alternative. However, compared with kernel-level reserves, middleware- and user-level processor reserves generally have higher overhead. More importantly, a middleware- or user-level reserve mechanism cannot efficiently support small latency (1-5 ms) guarantee and sub-millisecond budget granularity required by some applications.

For this reason, processor reserves are provided by the kernel in a future version of Microsoft Windows. Unlike the Illinois prototype [7], which provides completion time guarantee, the reserve mechanism is designed to provide bandwidth-latency guarantee to both sporadic and periodic executions of threads from real-time and general-purpose applications. Conceptually, a reserve (P, B) can be thought of as a constant utilization server. At each replenishment time, the reserve is given its budget B, and its deadline is set at current time plus P so that the instantaneous utilization of the reserve is equal to its bandwidth. A reserve is eligible for scheduling when it has budget and at least one thread in it is ready to run. When a reserve has no ready-to-run thread, its budget is reclaimed and made available to threads running without reserves. Eligible reserves are scheduled on the earliest-deadline-first (EDF) basis. Whenever a reserve is scheduled, the highest priority thread among threads in the reserve runs, regardless its priority relative to priorities of threads not in the reserve. Thus, the reserve protects threads in it from conflicting prioritization of threads outside the reserve. The system monitors the processor time consumed by threads in the reserve and stops scheduling the reserve (and hence threads in it) when the threads exhaust the reserve budget. The reserve becomes eligible for scheduling again when the system replenishes its budget at its deadline.

One may question why not replenish and schedule processor reserves according to the total bandwidth server (TBS) algorithm instead of constant utilization server. It is well known that TBS and its many variants yield better average response time and naturally allow exhausted reserves to share background processor time left unused by reserves. TBS would be a better choice if every thread in the system

runs in some reserve. On an open platform, most applications, drivers and system components do not use reserves. Their threads run without reserves. If reserves were scheduled according to the TBS algorithm, run-away threads in some reserve would starve these threads. Soft reserves (i.e., reserves that are allowed to compete for background time after they exhausted their budgets) need to be scheduled in the background of threads without reserves.

#### IV. DISK BANDWIDTH RESERVATION

Despite of numerous studies on real-time disk scheduling, algorithms suitable for disk bandwidth reservation in an open platform are yet to be found in literature. Most real-time disk scheduling algorithms are variants of EDF or least slack time (LST) algorithms. Their primary goal is to maximize schedulable utilization of real-time requests; keeping throughput high is secondary. An example is the EDF-scan algorithm. According to this algorithm, in each seek, the R/W head moves in the direction of the request with the earliest deadline, but stops to pick up requests along the way to that request for as long as the request has slack or the current time is within a window of some threshold length. A potential advantage of the algorithm is a higher schedulable real-time bandwidth. However, it is not clear whether this advantage is in fact realizable when one takes into account the extra amount of seek time that may incur, and the extra seek time is wasted. In general, priority-based algorithms do not work well when the server (in this case the R/W head) must walk from request to request. Starvation is also a problem and must be dealt with. Algorithms that use slack information have the additional burden of slack computation. The computation can be complicated especially since the disk scheduler in an open platform must work for all types of disks and volume configurations (e.g., striped and mirrored).

Weighted-round-robin (WRR)-scan offers a more practical solution. *WRR-scan* algorithm is a combination of scan, WRR and time-token algorithms. It was motivated by the following observations:

- Similar to processor reserve, each disk reservation (P, N) is specified by period P and number N of data blocks per period: A user of the reservation can read or write N blocks of data every period of length P by the end of the period. A stream of requests with a reservation behaves like a periodic task.
- 2. The problem of scheduling periodic requests in midst of interactive and paging requests resembles the problem of scheduling periodic message transmissions in midst of aperiodic messages in a FDDI network. A timed-scan algorithm similar to the FDDI time-token protocol may work better than priority-based algorithms.
- Unlike stations on a network, however, the disk scheduler has global knowledge of all outstanding requests during each scan. This knowledge allows the use of a centralized scheme similar to the WRR

scheme, which is used for scheduling periodic and aperiodic messages in packet-switched networks.

WRR-scan works like a standard scan algorithm: The R/W head starts from one end of the disk, seeks across the disk towards the other end, serves selected requests along the way until it reaches the furthermost selected request, and then returns to the starting end and does the next scan. The algorithm differs from the standard scan only in its choices of requests to service and how much of each request to service during each scan. WRR-scan resembles the WRR scheme in the sense that it is rate-based. It also divides time into rounds and allocates to each periodic request stream a number of slots per round, where a slot is the time required to access a block of data. Like the timed-token protocol, WRR-scan algorithm also must set aside "walking time", the time taken by the R/W head to move from request to request and across the disk.

The WRR-scan algorithm assumes that a new reservation is admitted only if it passes an acceptance test. The test is similar to the kind used for WRR algorithm: A new reservation (P, N) can be admitted only if within the P/R rounds in each of its period, where R the maximum round length, there are enough unreserved slots to meet its demand.

To explain the algorithm with the aid of an example, suppose that the parameters of a disk are as follows:

- 1. The minimum amount of data to be transferred is a block of 64kb. The transfer time of the block plus nominal seek and rotational latencies is 10 ms.
- 2. The chosen round length *R* is 200 ms. In other words, each round has at most 20 slots.
- 3. The degenerate round-trip seek time (walking time) of the disk is 50 ms. Hence 5 slots per round may be wasted in the worst case when requests serviced in the round are scattered across the disk. This time can be used opportunistically for background requests if during any scan, the actual seek time among all outstanding requests is smaller than 50 ms.
- 4. Three slots in each round are set aside to ensure acceptable response time for interactive requests. Therefore, only 12 slots out of each 200 ms round are available for requests with reservations.
- The disk is divided into zones based on locations of requests with reservations.

Suppose that there is a reservation (300, 3) when a new reservation (500, 10) is subjected to acceptance test. (500, 10) is acceptable because within each period of length 500, there are 2 rounds. The demand of (500, 10) can be met because the number of unreserved slots per round is larger than 5. After (500, 10) is admitted, 8 out of 12 slots of every round are reserved<sup>1</sup>. In the worst case, (200, 3) and (500, 10) are at the

first zone and last zone of the disk, respectively. So, five slots are used just to shuttle the arm between them. The number of slots available for interactive and background requests is at least 7 per round. (Note that one out of 5 rounds, (500, 10) has no pending transfer, and there are 12 slots available for interactive and background requests in that round.) These slots can be distributed among pending interactive and background requests according to any strategy.

The example illustrates that WRR-scan gives the scheduler good control over tradeoff between average response time and throughput of interactive and paging requests and total bandwidth made available to reservations. The amount of slack that is available for interactive and paging requests in each round can be easily determined from the slots, locations and pending flags of the requests with reservations.

#### VI. FUTURE WORK

A great deal of work remains to be done so that the predictability of real-time applications on open platforms can be assured. The last part of the lecture discusses examples of missing sciences and technology.

An obvious missing piece is platform support for network bandwidth and latency guarantees. Literatures offer numerous real-time communication algorithms and protocols that can be used to support network bandwidth reservation and qualify-of-service management. Many prototype protocol stacks provide bandwidth and latency guarantees. The fragmented results are yet to be integrated into widely used platforms and networks and their effectiveness for common applications and scenarios thoroughly evaluated.

A frequently asked question from application developers is "how do we know the amount of processor bandwidth to reserve". This question points to another example of missing techniques. Existing worst-case execution time analysis methods and tools cannot provide answer to this question. A component (e.g., an audio engine, a Kalman filter) in an open system may run on hundreds of different computers, different versions of operating systems, and depending on the runtime environment, makes use of different libraries, etc. At different times, hyper-threading may be on or off, and a variety of workload may run on other logical processors. Clearly, a static profile of the resource demands of a component is not useful. Dynamic runtime profiling and calibration can provide data on resource demands. The problem is not that there are no tools for this purpose. Rather, it is the lack of sound principles and experiment methods based on which tools can be built.

multiples of all possible periods. The additional memory required to hold the table is usually not a serious problem. More seriously, starts of rounds would have to be aligned with the starts of their periods if the scheduler were to take advantage of the additional slots in some rounds. This requirement would make scheduling and control considerably more complex and less robust.

<sup>&</sup>lt;sup>1</sup> Note that the scheduler over commits slots for both reservations. A seemingly better alternative is to keep track the actual number of slots required by each reservation in each round. For this purpose, the scheduler would need to maintain a table of reserved slots in individual rounds. The length of the table is the least common

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# Elements of Real Time Systems

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# **Lecture 1: Elements of Research**

The entrance to graduate school marks a *critical phase of transition* for most graduate students from absorbing knowledge to creating knowledge. This lecture provides useful advices on how to position R&D strategically; how to identify and formulate high impact problems; and how to communicate ideas and results effectively.

# **Lecture 2:** Generalized Rate Monotonic Scheduling

GRMS was designed to support the resource management of real time control systems, which consists of mostly periodic tasks with a small percentage of aperiodic events. GRMS has now been supported by most Real Time Operating Systems and open standards in real time computing. This lecture provides a tutorial on this subject for students who are new to real time computing field. This lecture begins with a review of characteristics of real time systems that set them apart from general purpose computing systems. It reviews the basic real time scheduling topics of schedulability tests for periodic tasks, synchronization of real time tasks, and the handling of aperiodic events.

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# **Lecture 3:** Queueing Theory Based Network Server Performance Control

Controlling the performance of a network server is a challenging problem in soft real time applications. This lecture presents a queuing model based feedback control approach to keep the timing performance of a network server close to the specification. The queueing predictor based feed forward control keeps the system in the neighborhood of the performance set point, independent of workload changes. This allows us to develop a linear controller to fine tune the performance by suppressing not only the approximation errors in the queueing model but also the transients that cannot be reduced by queueing model based tuning. Together, queueing theory and feedback control theory a synergistic approach to control the performance of networked information servers.

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# **Lecture 4:** Dependable Upgrade of Control Software

How to improve the reliability and availability of complex software systems is a serious challenge as software assumes an increasingly larger role in the critical functions of our society. It is a widely held belief that using diversity in software systems will improve system reliability. However, is it true? This lecture investigates the relationship between software complexity, reliability, degree of diversity and available resource for software development. Based on the result of this analysis, we present a forward recovery approach based on the idea of "using simplicity to control complexity". We show that this is an effective approach that can be applied systematically to software for automatic control systems.

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# The Timing Behavior of Embedded Systems: Specification, Prediction, and Checking

Alan Shaw

Abstract—The survey is based primarily on my 2001 textbook, emphasizing methods to describe, analyze, measure, and predict the timing properties of embedded software. Topics include extended state machine and logic techniques for specification; schema and optimization approaches to prediction; and programming language and operating system facilities for checking and controlling timing behaviors.

Index Terms—Execution time prediction, real-time systems, real-time software, timing analysis, timing specifications

#### I. INTRODUCTION

A N essential determinant of the correctness of any embedded system is its timing behavior. This behavior is measured not only by meeting performance or speed requirements, but often also by satisfying more complex, usually deterministic, constraints or assertions involving time.

We survey many of the models and techniques that have been used to deal with timing problems, starting with specification methods and working through to software support [1]. Most of the content appears in my textbook [2].

The first part gives a brief overview of embedded and real-time systems and a discussion of computer time and clocks [3]. In the following section, we outline several of the principal specification methods for describing requirements and designs, with emphasis on state machines, regular expressions, and real-time logic [4]. The next topic is how to predict the execution times of programs, using both timing schema and optimization approaches [5]. The final part is concerned with facilities in programming languages and operating systems that monitor and control time [6].

# II. EMBEDDED SYSTEMS AND COMPUTER TIME

Software for embedded and real-time systems differs from conventional software in a number of significant ways, such as the importance of clocks and timing constraints, physical concurrency, reliability and fault tolerance, testing and certification, and stand-alone operation. The main scheme for modeling and implementing programs is the *process* model developed for operating systems. Two kinds of processes are defined to handle the application area: *periodic* processes and *sporadic* processes, the latter corresponding to interrupt- or

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event-driven processes.

Computer time and clocks are employed for a wide variety of purposes. Examples are time-stamping the occurrence of events to indicate causality (e.g., for message sends and receives), measuring the time between events (e.g., for deadlines), unique naming of objects, computing keys in cryptography, synchronizing activities, and precisely measuring distance and position (e.g., GPS). Computer time should have certain properties relative to ideal or standard time. These include correctness, bounded drift, monotonicity, and chronoscopicity (bounded 2<sup>nd</sup> derivative of the clock function).

Clock servers provide computer users a number of basic services related to time. Typical offerings are absolute (calendar) clock times, stopwatch or relative time, clock reset and clock set. To maintain desirable clock properties, clocks need to be synchronized with standard or other clocks. This may occur through a centralized standard, such as GPS, or via a distributed method whereby a number of clocks achieve internal synchronization by passing clock timestamps to one another.

# III. SPECIFICATION METHODS

Formalisms for describing the behavior of systems can be classified as either imperative or declarative. In the first case, the methods are operational or executable, and directly generate behaviors. These include state machine and programming language notations. Declarative techniques, on the other hand, specify properties that behaviors must satisfy. Examples are axiomatic methods and logics.

The most interesting and difficult problems are concerned with concurrency and time. As typical solutions, we present useful extensions of state machines, regular expressions, and predicate logic.

Communicating real-time state machines (CRSMs) are an extension of state machines for a distributed real-time environment. Machines communicate (perform I/O with each other) over unidirectional channels through one-to-one message passing following Hoare's CSP model. Each state transition, denoted by a guarded command, has associated time bounds that define the best and worst case execution times for the transition. For I/O commands, the time bounds represent the window during which I/O can occur. Corresponding to each CRSM is a clock machine, a simple CRSM that delivers real-time to its host on request and allows timeouts to be easily described.

CRSMs are universal machines, and admit to simulation and verification software. Transitions occur on an

earliest-time first basis, with ties handled non-deterministically. Example systems that have been specified and simulated (or implemented) include: alarm clocks with ringing times and reset; mouse clickers with single click, double click, and object selection features; railway crossing control; traffic light control with emergency operations; and a commercial defibrillator.

A more declarative technique is the *flow expression* scheme, an extension of regular expressions with an interleaved model of concurrency. A shuffle operator and its closure are added to express the interleaving of symbols; restrictions on interleaving are described employing operators that are similar to binary semaphores. The result is a universal notation. The method has been used to specify ordering and causality properties, for example a "send" event must precede a "receive". Time is included by including discrete clock tick events in descriptions.

The addition of an event-occurrence function to predicate logic has produced a powerful notation called *real-time logic* (RTL). This partial function maps instances of event classes into time. RTL has been used to describe a wide variety of safety properties of systems, such as deadlines or "two planes must maintain a given separation distance from each other". It has also been implemented in run-time checkers where RTL expressions are evaluated at critical points to assure that constraints are met.

#### IV. PREDICTING EXECUTION TIMES

Determining the best and worst case execution times of a program *before* running it is not only a basic requirement for real-time and embedded systems but also a fundamental problem in computer science. While theoretically unsolvable in the general case, the problem can still be handled for many practical situations.

The difficulty is to achieve bounds that are both *tight* and *safe*, where a bound is tight if there exists an actual execution that is close to it and a bound is safe if there do not exist executions outside of it. It is also desirable to produce bounds that take into account or are independent of a variety of possible hardware or architectural interferences and complexities, such as interrupts and caching; and bounds that work under a variety of operating systems and compilers, and in the presence of competing programs. After a brief discussion of the two most practical, widely-used, but ultimately flawed approaches, measurement and simulation, we describe two promising methods: program analysis through timing schema and prediction through optimization techniques.

Correctly measuring the execution time of a particular program with its data in a given environment is not as easy as it appears, especially in embedded systems where computer components are closely coupled with other systems and I/O. It is also difficult, and often impractical, to find, run, and measure the best or worst case executions. Prediction by measurement also assumes that failure costs, for example, missing a deadline, are not catastrophic, and thus does not work well with safety-critical systems. Simulation avoids some, but not all, of these problems. In addition, one has to be careful to ensure that the results are practical despite the

inevitable abstractions that are made. Nevertheless, a combination of these two approaches, particularly for components or small systems, has proven successful.

The *Timing schema* method is based on program analysis at the source language level. It is assumed that best and worst case execution bounds are available for each basic or atomic component of the programming language, taking the compiler and machine architecture into account; the granularity or definition of an atomic component could be as large as a basic block or as small as a lexical item in the language. The timing costs of control constructs, for example, conditional testing and branching, are included. These times can be found, for example, by measurement.

Safe, but not necessarily tight, bounds on execution times are first obtained through a static analysis of the program structure. For example, a safe estimate of the worst case time is obtained by computing the longest path through the program. Much of this can be accomplished automatically. However, user input and verification is required for bounding the number of executions of loops.

Tighter estimates result when larger granularity atomic components are used and when a more dynamic analysis is superimposed. In the latter case, extended regular expressions have been employed successfully to describe contextual restrictions on program paths. It is also possible to accurately incorporate many hardware interferences; for example, executions in the presence of interrupts can be analyzed provided that bounds on interrupt separation times and handling times are available. The ideas have been validated with software tools through a number of experiments that compare measured results with predictions for a representative sample of relatively small programs.

Another attractive approach models timing prediction as an *optimization* problem. Worst (or best) case execution time is expressed as the maximum (or minimum) of a function that is the sum of the product of the execution time of each block of the program and the number of times it is executed; the number of times each block is executed is unknown. The function is subject to a number of structural constraints which essentially conserve program flow, and contextual constraints, such as loop bounds and path restrictions, that have to be verified independently. These constraints can be written as linear inequalities involving the unknown variables.

The result is a (potentially large) number of integer linear programming problems, each of which can be solved with a standard solver. The desired bound is computed by taking the maximum (or minimum) of all the solutions. This method has also been validated with many experiments.

A difficult underlying issue for both methods is how to accurately include many of the speed-enhancing features of the underlying hardware architectures. Examples include data and instruction caches, pipelining, and translation lookaside buffers. Much work has been done exploring this problem, for example, also using optimization techniques, but general solutions remain elusive. It could very well be that in order to obtain deterministic predictability, one must sacrifice gains in average speed.

#### V. SOFWARE SUPPORT

Many modern programming languages and operating systems provide basic and higher level features that allow the user to control and measure the timing behavior of software for embedded systems. These include clock servers as outlined in Section II, alarm clocks that generate timeout events at some future time, instructions to delay a task or thread for some specified time, and blocking synchronization and resource acquisition operations that provide timeouts. An important feature of these facilities is that they include bounds on the timing accuracy and overhead; for example, a delay operation might include a guarantee that the delayed task will appear on a ready list within a given number of time Some research systems support units after expiration. higher-level specifications; a typical example is one that permits the direct declaration of a periodic process, including start time, period, and deadline.

Two well-known languages with good timing constructs are Ada with its real-time annex and real-time Java. In both cases, the timing facilities are high resolution, high accuracy, and monotonic versions of the analogous objects of the hosts (standard Ada and Java). In addition, real-time Java offers a novel timing object called rational time that deals in frequencies. Both languages also permit better management of concurrency, for example, including priority inheritance protocols which allow more scheduling control and thus timing predictability.

Many language features are directly implemented as operating systems interfaces or run-time utilities. Real-time versions of UNIX and the associated real-time extensions to the IEEE POSIX standard implement many of the mentioned clock facilities and define direct interfaces to programming languages.

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# Stochastic Analysis of Real-Time Systems

Kanghee Kim, José Luis Díaz, Lucia Lo Bello, José María López, Chang-Gun Lee, Daniel F. García, Sang Lyul Min, and Orazio Mirabella

Abstract—This paper describes an exact stochastic analysis for general priority-driven periodic real-time systems. The proposed analysis accurately computes the response time distribution of each task in the system, thus making it possible to determine the deadline miss probability of individual tasks, even for systems with a maximum utilization factor greater than 1. The analysis is uniformly applied to general priority-driven systems, including fixed-priority systems (such as Rate Monotonic) and dynamic-priority systems (such as Earliest Deadline First), and can handle tasks with arbitrary relative deadlines and execution time distributions. In the paper, we demonstrate the accuracy of the analysis in comparison with other methods proposed in the literature.

Index Terms—Real-time systems, Stochastic analysis, Priority-driven scheduling, Periodic tasks

#### I. INTRODUCTION

Most recent research on hard real-time systems has used the periodic task model [1] in analyzing the schedulability of a given task set where tasks are released periodically. Based on this periodic task model, various schedulability analysis methods for priority-driven systems have been developed to provide a deterministic guarantee that all the instances, called *jobs*, of every task in the system meet their deadlines, assuming that every job in a task requires its worst case execution time [1], [2], [3].

Although this deterministic timing guarantee is needed in hard real-time systems, it is too stringent for soft real-time applications that only require a probabilistic guarantee that the deadline miss ratio of a task is below a given threshold. For soft real-time applications, we need to relax the assumption that every instance of a task requires the worst case execution time in order to improve the system utilization.

Progress has recently been made in the analysis of real-time systems under the stochastic assumption that jobs from a task require variable execution times. Research in this area can be categorized into two groups depending on the approach used to facilitate the analysis. The methods in the first group introduce a pessimistic or restrictive assumption to simplify the analysis.

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For example, the Stochastic Time Demand Analysis [4] tries to compute an upper on the deadline miss probability of each task assuming the worst-case combination of task release times, called a *critical instant*. As another example, Real-Time Queueing Theory [5], [6] has a restrive assumption that the system to be analyzed should have an average system utilization close to 1, called *heavy traffic conditions*. On the other hand, the analysis methods in the second group [7], [8] assume a *reservation-based scheduling model* that provides isolation between tasks, and thus decompose the stochastic analysis of an entire system into those of *n* independent virtual systems (*n*: the number of tasks).

In this paper, we describe an exact stochastic analysis that does not introduce any worst-case or restrictive assumptions into the analysis. The proposed analysis assumes neither a critical instant nor heavy-traffic conditions, thus can give an accurate deadline miss probability for each task in a system with an arbitrary system utilization value. Moreover, the analysis assumes general priority-driven scheduling, thus can uniformly address both fixed-priority systems such as Rate Monotonic [1] and Deadline Monotonic [9] and dynamic-priority systems such as Earliest Deadline First [1]. It should be noted that our analysis builds upon the Stochastic Time Demand Analysis (STDA) in that we largely borrow the basic techniques developed in the STDA.

The rest of the paper is organized as follows. In Section II, we describe the system model, and in Section III, explain the proposed analysis. In Section IV, we give experimental results obtained by our analysis in comparison with STDA. Finally, in Section V, we conclude the paper with directions for future research.

#### II. SYSTEM MODEL

We assume a set of n independent periodic tasks  $\{\tau_1,\ldots,\tau_n\}$ , each task  $\tau_i$   $(1\leq i\leq n)$  being modeled by the tuple  $(T_i,\phi_i,C_i,D_i)$ , where  $T_i$  is the period of the task,  $\phi_i$  its initial phase,  $C_i$  its execution time, and  $D_i$  its relative deadline. The execution time  $C_i$  is a discrete random variable with a given probability mass function of a finite range, denoted by  $f_{C_i}(t) = \mathbf{P}\{C_i = t\}$ . The execution time distribution can be given by a measurement-based analysis such as automatic tracing analysis [10] or an analytical program analysis such as probabilistic worst case execution time analysis [11]. Without loss of generality, the phase  $\phi_i$  of each task  $\tau_i$  is assumed to be smaller than  $T_i$ . The relative deadline  $D_i$  can be smaller than, equal to, or greater than  $T_i$ .

We define the system utilization as the total utilization of all tasks in the system. Since the execution times of tasks are varying, the minimum  $U^{min}$ , average  $\bar{U}$ , and maximum system

utilization  $U^{max}$  are defined as follows:

$$U^{min} = \sum_{i=1}^{n} \frac{C_i^{min}}{T_i}, \quad \bar{U} = \sum_{i=1}^{n} \frac{\bar{C}_i}{T_i}, \quad U^{max} = \sum_{i=1}^{n} \frac{C_i^{max}}{T_i}.$$

In addition, we define a hyperperiod of the task set as a period of length  $T_H$ , which is equal to the least common multiple of all the task periods.

Each task gives rise to an infinite sequence of jobs, whose release times are deterministic. If we denote the jth job of task  $\tau_i$  by  $J_{i,j}$ , its release time  $\lambda_{i,j}$  is equal to  $\phi_i + (j-1)T_i$ . Each job  $J_{i,j}$  requires an execution time, which is described by a random variable following the given distribution  $f_{C_i}(t)$  for  $\tau_i$ . The execution time of a job is assumed to be independent of other jobs of the same task and those of other tasks.

We assume job-level fixed-priority preemptive scheduling [12]. This model covers both task-level fixed-priority scheduling such as Rate Monotonic (RM) and Deadline Monotonic (DM), and task-level dynamic-priority scheduling such as Earliest Deadline First (EDF). We denote the priority of job  $J_j$  by a priority value  $p_j$ . Note that a higher priority value means a lower priority.

We obtain the deadline miss probability  $DMP_i$  from the response time distribution of task  $\tau_i$ . We denote a random variable describing the response time of  $\tau_i$  by  $R_i$  and its distribution by  $f_{R_i}(t)$ .

$$DMP_i = \mathbf{P}\{R_i > D_i\} = \sum_{t=D_i+1}^{\infty} f_{R_i}(t).$$
 (1)

# III. STOCHASTIC ANALYSIS

The goal of the proposed analysis is to accurately compute the deadline miss probability of every task in the system. To compute the deadline miss probability, we have to compute the response time distribution of the task towards which a response time profile obtained in a real system converges. Thus, we define the response time distribution of each task as follows:

Definition 1: The response time distribution  $f_{R_i}(t)$  of each task  $\tau_i$  is defined as the average of the stationary response time distributions of all the jobs  $J_{i,j}$  from  $\tau_i$  in a steady-state hyperperiod. Let  $m_i$  be the number of jobs of  $\tau_i$  released in a hyperperiod, i.e.,  $m_i = T_H/T_i$ , and  $f_{R_{i,j}^{(k)}}(t)$  the response time

distribution of job  $J_{i,j}^{(k)}$ , i.e., the *j*th job of task  $\tau_i$  in the *k*th hyperperiod. Then,

$$f_{R_i}(t) = \frac{1}{m_i} \sum_{i=1}^{m_i} \lim_{k \to \infty} f_{R_{i,j}^{(k)}}(t).$$

Thus, to compute the response time distribution of a task  $\tau_i$ , we have to compute the stationary response time distributions of all the jobs from  $\tau_i$  in a steady-state hyperperiod.

The response time  $R_j$  of a job  $J_j$  is determined by two factors. One is the pending workload that delays the execution of  $J_j$ , which is observed at its release time  $\lambda_j$ . We call this pending workload backlog. The other is the workload of jobs that may preempt  $J_j$ , which are released after  $J_j$ . We call this workload interference. Since both the backlog and the interference for  $J_j$  consist of jobs with a priority higher than that of  $J_j$ , we elaborate the two terms to  $p_j$ -backlog and

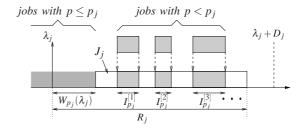


Fig. 1. Factors affecting the response time of a job

 $p_j$ -interference, respectively. Thus, the response time  $R_j$  of  $J_j$  can be expressed by the following equation:

$$R_j = W_{p_j} + C_j + I_{p_j} \tag{2}$$

where  $W_{p_j}$  is the  $p_j$ -backlog observed at time  $\lambda_j$ ,  $C_j$  is the execution time of  $J_j$ , and  $I_{p_j}$  is the  $p_j$ -interference occurring after time  $\lambda_j$ .

Therefore, the first step to compute the response time distribution of  $J_j$  is to compute its  $p_j$ -backlog distribution, and the second step is to introduce the execution time distribution of  $J_j$  and the  $p_j$ -interference effect into the  $p_j$ -backlog distribution. This second step is rather easy, since we can reuse the techniques introduced in STDA with no modification.

However, the first step is complex, since the  $p_j$ -backlog distribution should be computed when the system is in steady state. This means that for every job  $J_j$  we have to compute its  $p_j$ -backlog distribution in the kth hyperperiod, assuming that  $k \to \infty$ . Thus, we need to consider the sequence of all the preceding jobs for each single job  $J_j^{(k)}$  in hyperperiod k, that are released with a priority higher than or equal to that of  $J_j^{(k)}$ . In this case, the job sequence spans over all the preceding hyperperiods 1, 2, ..., k-1, since the  $p_j$ -backlog distribution of  $J_j^{(k)}$  in hyperperiod k can be affected even by the jobs released in the preceding hyperperiods when  $U^{max}$  is greater than 1.

In our analysis, however, we do not consider a separate job sequence for each job  $J_j^{(k)}$ . Instead, we show that it is possible to compute the  $p_j$ -backlog distribution of a job from that of another, thus reduce the computation of the  $p_j$ -backlog distributions of all the jobs  $J_j^{(k)}$  in hyperperiod k to that of a single job in the hyperperiod. This is based on the observation that under job-level fixed-priority scheduling there exist backlog dependencies among the jobs. For example, let us consider the task set example shown in Figure 2(a). If we assume that the task set is scheduled by EDF, we can easily see that the backlog  $W_{p_2}$  of  $J_2$  can directly be computed from  $W_{p_1}$  while considering the execution time of  $J_1$ . Likewise, the backlog  $W_{p_3}$  of  $J_3$  can also directly be computed from  $W_{p_1}$ . That is, along the backlog dependency tree shown in Figure 2(c), we can compute the  $p_i$ -backlog distributions of all the other jobs  $J_i$  from that of  $J_1$  (In the tree, the label attached on each link  $W_{p_i} \rightarrow W_{p_j}$  represents the jobs that should be considered in computing  $f_{W_{p_i}}(t)$  from  $f_{W_{p_i}}(t)$ ).

Then the remaining question is how to compute the  $p_j$ -backlog distribution for the root of the backlog dependency tree. We address this problem by showing that the root is always the backlog of a *ground job*, which is defined as a job  $J_j$  that has a lower priority than all the jobs preceding  $J_j$ .

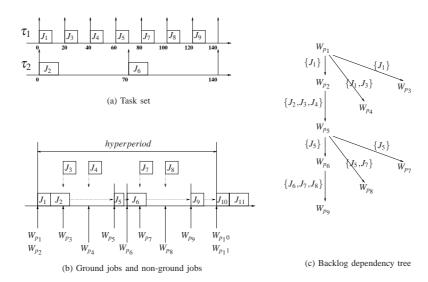


Fig. 2. An example of backlog dependency tree generation

This means that the  $p_j$ -backlog of such a job is always equal to the total backlog in the system observed at the same time, called *system backlog W*, and thus it is possible to compute its stationary distribution by Markov process modeling. That is, we prove that the evoluation of the system backlog over hyperperiods  $\{W^{(1)}, W^{(2)}, \cdots, W^{(k)}, \cdots\}$  as a Markov process, derive a set of equilibrium equations, and solve them.

Therefore, the proposed analysis is summarized into the following three steps: 1) compute the stationary system backlog distribution of a ground job by Markov process modeling (steady-state system backlog analysis), 2) compute the stationary  $p_j$ -backlog distributions of all the other jobs using backlog dependencies ( $p_j$ -backlog analysis), and 3) construct the stationary response time distributions of all the jobs by introducing into each stationary  $p_j$ -backlog distribution the execution time distribution of the job  $J_j$  and the  $p_j$ -interference effect ( $p_j$ -interference analysis). For more details on these three steps, refer to [13].

#### IV. EXPERIMENTAL RESULTS

To evaluate the sensitivity of the proposed analysis to the system utilization, we use five task sets with different utilization values, as shown in Table I. All the task sets consist of three tasks with the same periods, the same deadlines, and null phases, thus result in the same backlog dependency tree for any scheduling algorithm.

Table I summarizes the results of our analysis, including the results obtained by STDA for the case of RM. This table shows the deadline miss probability (DMP) for each task and the average deadline miss ratio (DMR) and standard deviation obtained from simulations. The average DMR is obtained by averaging the deadline miss ratios measured from 100 simulation runs of each task set, performed during 5000 hyperperiods.

From Table I, we can see that our analysis results are almost identical to the simulation results. For the case of STDA, however, the analysis results get worse as  $\bar{U}$  or  $U^{max}$  increases. In the case of  $\tau_3$  in task set A, the DMP given by STDA

(39.3%) is more than four times the DMP given by our analysis (9.4%).

# V. CONCLUSIONS AND FUTURE WORK

In this paper we have proposed a stochastic analysis to accurately compute the response time distributions of tasks for general priority-driven periodic real-time systems. The proposed analysis can be uniformly applied to general prioritydriven system including both fixed-priority systems such as RM and DM, and dynamic-priority systems such as EDF, thanks to the backlog dependency relations among all the jobs in a hyperperiod. The experimental results have shown that our analysis is highly accurate regardless of the system utilization, while STDA is not. For future work, it should be addressed how to reduce the computational complexity of the analysis, which is known as  $O(n^3m^3)$  (n: the number of jobs in a hyperperiod, m: the maximum length of the execution time distributions), and whether it is possible to safely analyze tasks that have variable interrelease times with our analysis by modeling them as periodic tasks.

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				execution times			utilizations		RM			EDF		
task set		$T_i$	$D_i$	$C_i^{min}$	$C_i$	$C_i^{max}$	$U^{min}$	Ū	$U^{max}$	simulation	STDA	our analysis	simulation	our analysis
A	$\tau_1$	20	20	4	6	10				$.0000 \pm .0000$	.0000	.0000	$.0001 \pm .0000$	.0001
	$\tau_2$	60	60	12	16	22	.58	.82	1.27	$.0000 \pm .0000$	.0000	.0000	$.0000 \pm .0000$	.0000
	$\tau_3$	90	90	16	23	36				$.0940 \pm .0025$	.3931	.0940	$.0000 \pm .0000$	.0000
	$ au_1$	20	20	4	6	10	.58	.87	1.27	$.0000 \pm .0000$	.0000	.0000	$.0013 \pm .0002$	.0013
В	$\tau_2$	60	60	12	17	22				$.0000 \pm .0000$	.0000	.0000	$.0005 \pm .0002$	.0005
	$\tau_3$	90	90	16	26	36				$.2173 \pm .0033$	.6913	.2170	$.0000 \pm .0001$	.0000
	$\tau_1$	20	20	4	7	10	.58	.92	1.27	$.0000 \pm .0000$	.0000	.0000	$.0223 \pm .0013$	.0224
С	$\tau_2$	60	60	12	17	22				$.0000 \pm .0000$	.0000	.0000	$.0168 \pm .0014$	.0169
	$\tau_3$	90	90	16	26	36				$.3849 \pm .0052$	.9075	.3852	$.0081 \pm .0011$	.0081
	$\tau_1$	20	20	3	7	11				$.0000 \pm .0000$	.0000	.0000	$.0626 \pm .0031$	.0627
C1	$\tau_2$	60	60	10	17	24	.46	.92	1.38	$.0000 \pm .0000$	.0000	.0000	$.0604 \pm .0038$	.0607
	$\tau_3$	90	90	13	26	39				$.4332 \pm .0065$	.9209	.4334	$.0461 \pm .0032$	.0463
C2	$\tau_1$	20	20	2	7	12				$.0000 \pm .0000$	.0000	.0000	$.1248 \pm .0058$	.1250
	$\tau_2$	60	60	8	17	26	.34	.92	1.50	$.0002 \pm .0001$	.0018	.0002	$.1293 \pm .0064$	.1296
	$\tau_3$	90	90	10	26	42				$.4859 \pm .0081$	.9339	.4860	$.1136 \pm .0063$	.1138

TABLE I

COMPARISON BETWEEN THE SIMULATION AND THE ANALYSIS

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# The Synchronous Programming Paradigm

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#### I. THE APPLICATION DOMAIN

Synchronous programming was proposed in the early eighties, as a paradigm for designing *reactive systems*. Therefore, the application domain mainly consists of computer systems performing real-time control over a physical environment, like those encountered in industrial control. These systems have to react to their environment at a speed which is determined by the environment (i.e., the environment cannot wait). Apart from this real-time behavior, these systems share some common features:

- They are generally *safety critical*, since they influence a physical environment. So, it is a privileged application domain for formal design and validation methods.
- They involve *concurrency*, at several levels: (1) at least, the concurrent execution of the system and its environment must be taken into account; (2) they are often implemented on distributed architectures, for fault tolerance, and/or because of the geographical position of physical devices (sensors, actuators); (3) it is often convenient to structure them as sets of parallel processes (the classical example is a digital watch, which involves a timekeeper, an alarm manager, a stopwatch, ..., all considered as parallel processes). This third kind of concurrency is very important to decompose the design of a reactive system; it has little, or nothing, to do with an actual concurrent execution, at runtime: the concurrent processes can be scheduled and sequentialized at compile-time. This is why this kind of concucurrency will be called logical concurrency.
- They are intended to be *deterministic*: nobody would like an aircraft autopilot to react nondeterministically! Reconciling (logical) concurrency with determinism is the main purpose of the synchronous model.

#### II. PRINCIPLES AND LANGUAGES

In the synchronous model, the behaviour of a program is a sequence of steps (or logical instants), which can be triggered by events coming from the environment, or simply by periodic activations. All the processes share this same logical time scale, and are involved in all the reactions.

A very fruitful analogy concerns synchronous circuits: basically, such a circuit can be viewed as being made of memory elements (flip-flops), synchronized on a clock, and of a combinational part, which computes, at each clock cycle, the current outputs and the next values of memories, from the current input and memory values (Fig. 1). In other words, in response to a sequence  $i_0, i_1, \ldots, i_n, \ldots$  of input vectors, the circuit computes a sequence  $o_0, o_1, \ldots, o_n, \ldots$  of output vectors such that,  $\forall n \geq 0, \ o_n = F_S(i_n, m_n)$ , where the memory vectors satisfy  $m_{n+1} = F_M(i_n, m_n)$ , and  $m_0$  is the initial value of the memory.

Now, the combinational function F may consist of a network of gates computing in parallel. Two circuits can be composed in parallel, by wiring back some outputs of each of them to the other's inputs (Fig. 2). The components of  $F_1$  and  $F_2$  run in parallel, or according to an order compatible with variables dependences. Of course, such a composition only works if no combinational loop is created between variables computed by  $F_1$  and  $F_2$ . In synchronous programming, this property is called *causality*: there should exist a (partial) order for evaluating the variables of the program; depending on the language, this order must either be global, or may change at each clock cycle.

The synchronous model is just a generalization of this model to work on data of arbitrary types, and to be

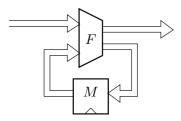


Fig. 1. Synchronous circuit

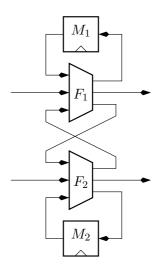


Fig. 2. Synchronous composition

used not only for hardware but also for software. The connection between synchronous programming and the circuit model is more or less apparent, depending of the style of the language used:

• The similarity is obvious for data-flow languages, like Lustre [1] or Signal [2]. In these languages, a program can be viewed as a generalized circuit. As a matter of fact, the "circuit" of Fig. 1 would be described in Lustre by the following equation:

$$(O,M) = F(I, M0 -> pre(M))$$

which expresses that, at each instant (clock cycle), the values of the outputs O and the memories M are the results of the combinational function F applied to current inputs I and to previous values of the memory (pre(M)), initialized with MO.

• In imperative languages like Esterel [3], [4] or Syncchart [5], the underlying circuit model is less evident. It is more natural to consider a program as a synchronous composition of automata, which may be hierarchic (in the sense that a "state" of an automaton can be "refined" by a sub-automaton). Such a program is compiled into a generalized circuit as before. For instance, the classical "timekeeper" program, where a first process counts "seconds" to emit "minutes" towards an other process counting "minutes" to emit "hours", etc., can be written as follows in Esterel:

and behaves exactly as written: in the same logical instant where the 60th SECOND happens, the MINUTE signal is emitted, and perceived by all processes which are "listening" to it, and in particular by the one which takes care of HOURs, the counter of which is incremented in the very same reaction. This program can also be viewed as the synchronous product of two interpreted automata (Fig. 3). Logical instants correspond to, possibly simultaneous, firings of transitions: every sixty SECONDs, the former automaton emits a MINUTE signal, which triggers a transition of the later automaton.

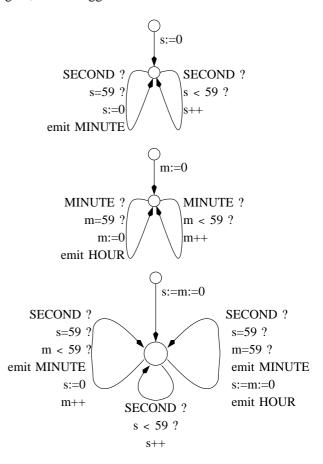


Fig. 3. Synchronous counters and their product

#### III. IMPORTANT TOPICS AND ONGOING RESEARCH

This section briefly reviews the main topics specific to the synchronous model, and the current trends of research.

- a) Semantics issues: One of the main features of synchronous languages is their completely formal and clean semantics. In particular, the timing behaviour of programs is perfectly determined with respect to the logical time scale. We already mentioned the semantic problem of causality, which is specific to synchronous languages: One can write programs with combinational loops, which don't make sense in general, but are sometimes difficult to detect. This question, which is now completely solved [6], originated most problems of "almost synchronous" formalisms, like Statecharts or Sequential Function Charts.
- b) Compilation: Most efforts were devoted to sequential code generation. Two main solutions were explored, together with intermediate versions: the compilation into an explicit automaton which produces very efficient code, but often involves an explosion of the code size and the translation into a single loop "read inputs / compute outputs / update memories". Generating code for distributed architectures is much more difficult [7], [8] and still concerns ongoing research. Compiling synchronous languages into circuits is also an important topic [9], [10]
- c) Verification: Program verification is of course an important goal for reactive systems. The synchronous model enjoys a very nice feature in this domain: programs, called synchronous observers, can be used to express safety properties of other programs. Such an observer is a program taking as inputs the signals or variables which are relevant for the property, and emitting an "alarm" whenever the property is violated. They are used both for expressing desired properties of programs, and assumptions about their environment (for a property is rarely satisfied independently of any knowledge about the environment). The verification goal is then to establish that, when considering the combination of the program and its two observers (Fig. 4), if the assumption observer never complains, neither does the property observer. Such a verification can be performed using standard model-checking techniques (possibly using abstraction) [11], [12], [13], or abstract interpretation [14]. Program testing is also an important topic [15] which can benefit from the technique of synchronous observers.
- d) Language issues: Synchronous languages are still under development. Trends are to introduce asynchronous concepts [16], [17], and to combine imperative and data-flow concepts [18]: now, Esterel-V7 integrates Esterel and Lustre.

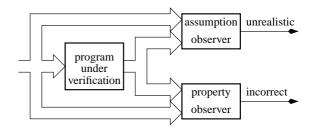


Fig. 4. Synchronous observers

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There is no room, here, for an exhaustive bibliography on the domain of synchronous programming. However, most references can be found from a few basic books [19], [3] and articles [20], [21], [22].

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# Formal Methods for Schedulability and Performance Analysis of Real-Time Embedded Systems

#### I. MOTIVATION

Reliability in real-time systems can be improved through the use of formal methods for the specification and analysis of timed behaviors. Recently, there has been a spate of progress in the development of real-time formal methods. Much of this work falls into the traditional categories of untimed systems such as temporal logics, assertional methods, netbased models, automata theory and process algebras. In this paper, we provide an overview of the family of resource-bound real-time process algebras that we have developed.

Process algebras, such as CCS [8], CSP [5], Acceptance Trees [4] and ACP [2], have been developed to describe and analyze communicating, concurrently executing systems. They are based on the premises that the two most essential notions in understanding complex dynamic systems are concurrency and communication [8]. The most salient aspect of process algebras is that they support the *modular* specification and verification of a system. This is due to the algebraic laws that form a compositional proof system which enables the verification of a whole system by reasoning about its parts. Process algebras are being used widely in specifying and verifying concurrent systems.

Algebra of Communicating Shared Resource (ACSR) introduced by Lee *et. al.* [7], is a timed process algebra which can be regarded as an extension of CCS. The timing behavior of a real-time system depends not only on delays due to process synchronization, but also on the availability of shared resources. Most current real-time process algebras adequately capture delays due to process synchronization; however, they abstract out resource-specific details by assuming idealistic operating environments. On the other hand, scheduling and resource allocation algorithms used for real-time systems ignore the effect of process synchronization except for simple precedence relations between processes. ACSR algebra provides a formal framework that combines the areas of process algebra and real-time scheduling, and thus, can help us to reason about systems that are sensitive to deadlines, process

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interaction and resource availability.

ACSR supports the notions of resources, priorities, interrupt, timeout, and process structure. The notion of real-time in ACSR is quantitative and discrete, and is accommodated using the concept of timed actions. Executing a timed action requires access to a set of resources and takes one unit of time. Resources are serially reusable, and access to them is governed by priorities. Similar to CCS, the execution of an event is instantaneous and never consumes any resource. The notion of communication is modeled using events through the execution of complementary events, which are then converted into an internal event. As with timed actions, priorities are also used to arbitrate the choice of several events that are possible at the same time. Although the concurrency model of CCS-like process algebras is based on interleaving semantics, ACSR includes interleaving semantics for events as well as lock-step parallelism for timed actions.

The computation model of ACSR is based on the view that a real-time system consists of a set of communicating processes that use shared resources for execution and synchronize with one another. The use of shared resources is represented by timed actions and synchronization is supported by instantaneous events. The execution of a timed action is assumed to take one time unit and to consume a set of resources during the same time unit. Idling of a process is treated as a special timed action that consumes no resources. The execution of a timed action is subject to availability of the resources used in the timed action. The contention for resources is arbitrated according to the priorities of competing actions. To ensure the uniform progression of time, processes execute timed actions synchronously. Unlike a timed action, the execution of an event is instantaneous and never consumes any resource. Processes execute events asynchronously except when two processes synchronize through matching events. Priorities are used to direct the choice when several events are possible at the same

We have extended ACSR into a family of process algebras, GCSR [1], Dense-time ACSR [3], ACSR-VP [6], PACSR [9] and P<sup>2</sup>ACSR [10]. GCSR is a graphical version of ACSR which allows the visual representation of ACSR processes.

Dense-time ACSR is an extension of ACSR with dense time. ACSR-VP extends ACSR with value-passing capability so that arbitrary scheduling problems can be specified and analyzed. PACSR (Probabilistic ACSR) allows the modeling of resource failure with probabilities, whereas P<sup>2</sup>ACSR extends PACSR with the notion of power consumption and resource constraints of embedded systems.

#### II. BACKGROUND: THE COMPUTATION MODEL

In our algebra there are two types of actions: those which consume time, and those which are instantaneous. The time-consuming actions represent one "tick" of a global clock. These actions may also represent the consumption of resources, e.g., CPUs, devices, memory, batteries in the system configuration. In contrast, the instantaneous actions provide a synchronization mechanism between a set of concurrent processes.

**Timed Actions.** We consider a system to be composed of a finite set of serially reusable resources, denoted by  $\mathcal{R}$ . An action that consumes one "tick" of time is drawn from the domain  $\mathbb{P}(\mathcal{R} \times \mathbb{N})$ , with the restriction that each resource be represented at most once. As an example, the singleton action,  $\{(r,p)\}$ , denotes the use of some resource  $r \in \mathcal{R}$  running at the priority level p. The action  $\emptyset$  represents idling for one time unit, since no resuable resource is consumed.

We use  $\mathcal{D}_R$  to denote the domain of timed actions, and we let A, B, C range over  $\mathcal{D}_R$ . We define  $\rho(A)$  to be the set of resources used by the action A; e.g.,  $\rho(\{(r_1, p_1), (r_2, p_2)\}) = \{r_1, r_2\}$ . We also use  $\pi_r(A)$  to denote the priority level of the use of resource r in action A; e.g.,  $\pi_{r_1}(\{(r_1, p_1), (r_2, p_2)\}) = p_1$ . By convention, if r is not in  $\rho(A)$ , then  $\pi_r(A) = 0$ .

**Instantaneous Events.** We call instantaneous actions *events*, which provide the basic synchronization in our process algebra. We assume a set of channels L. An event is denoted by a pair (a,p), where a is the *label* of the event, and p is its *priority*. Labels are drawn from the set  $\mathcal{L} \cup \bar{\mathcal{L}} \cup \{\tau\}$ , where for all  $a \in L$   $a? \in \mathcal{L}$  and  $a! \in \bar{\mathcal{L}}$ . We say that a? and a! are *inverse* labels. As in CCS, the special identity label,  $\tau$ , arises when two events with inverse labels are executed in parallel.

We use  $\mathcal{D}_E$  to denote the domain of events, and let e, f and g range over  $\mathcal{D}_E$ . We use l(e) and  $\pi(e)$  to represent the label and priority, respectively, of the event e. The entire domain of actions is  $\mathcal{D} = \mathcal{D}_R \cup \mathcal{D}_E$ , and we let  $\alpha$  and  $\beta$  range over  $\mathcal{D}$ .

The executions of a process are defined by a timed labeled transition system (timed LTS). A timed LTS M is defined as  $\langle \mathcal{P}, \mathcal{D}, \rightarrow \rangle$ , where (1)  $\mathcal{P}$  is a set of ACSR processes, ranged over by P, Q, (2)  $\mathcal{D}$  is a set of actions, and (3)  $\rightarrow$  is a labeled transition relation such that  $P \xrightarrow{\alpha} Q$  if the process P may perform an instantaneous event or timed action  $\alpha$  and then behave as Q.

For example, a process  $P_1$  may have the following behavior:  $P_1 \xrightarrow{\alpha_1} P_2 \xrightarrow{\alpha_2} P_3 \xrightarrow{\alpha_3} \dots$  That is,  $P_1$  first executes  $\alpha_1$  and evolves into  $P_2$ , which executes  $\alpha_2$ , etc. It takes no time to execute an instantaneous event. A timed action however is executed for exactly one unit of time.

### III. A FAMILY OF RESOURCE-BOUND REAL-TIME PROCESSES

We briefly describe four process algebras: ACSR, PACSR, ACSR-VP and P<sup>2</sup>ACSR.

#### A. Real-Time Processes

The following grammar describes the syntax of ACSR processes.

$$\begin{array}{ll} P & ::= & \mathrm{NIL} \mid (a,n).\,P \mid A:P \mid P+P \mid P || P \mid | \\ & P \bigtriangleup_t^a(P,P,P) \mid P \backslash F \mid [P]_I \mid P \backslash I \mid b \to P \mid C. \end{array}$$

The process NIL represents the inactive process. There are two prefix operators, corresponding to the two types of actions. The process (a,n). P executes the instantaneous event (a,n) and proceeds to P. The process A:P executes a resource-consuming action during the first time unit and proceeds to P. The process P+Q represents a nondeterministic choice between the two summands. The process  $P\|Q$  describes the concurrent composition of P and Q: the component processes may proceed independently or interact with one another while executing events, and they synchronize on timed actions.

The scope construct,  $P extstyle \Delta_t^a(Q,R,S)$ , binds the process P by a temporal scope and incorporates the notions of timeout and interrupts. We call t the *time bound*, where  $t \in \mathbb{N} \cup \{\infty\}$  and require that P may execute for a maximum of t time units. The scope may be exited in one of three ways: First, if P terminates successfully within t time-units by executing an event labeled a! where  $a \in L$ , then control is delegated to Q, the success-handler. Else, if P fails to terminate within time t then control proceeds to R. Finally, throughout execution of this process construct, P may be interrupted by process S.

In  $P \setminus F$ , where  $F \subseteq L$ , the scope of channels in F is restricted to process P, and thus, components of P may use these labels to interact with one another but not with P's environment. The construct  $[P]_I$ ,  $I \subseteq \mathcal{R}$ , produces a process that reserves the use of resources in I for itself, extending every action A in P with resources in  $I - \rho(A)$  at priority 0.  $P \setminus I$  hides the identity of resources in I so that they are not visible on the interface with the environment. That is, the operator  $P \setminus I$  binds all free occurrences of the resources of I in I. This binder gives rise to the sets of free and bound resources of a process I. Process I if boolean expression I evaluates to true and as I if boolean expression I with process definition I def I allows standard recursion.

#### B. Resource Probabilities and Actions

PACSR (Probabilistic ACSR) extends the process algebra ACSR by associating with each resource a probability. This probability captures the rate at which the resource may fail. Since instantaneous events in PACSR are identical to those of ACSR, we only discuss timed actions, which now can account for resource failure.

**Timed Actions.** As in ACSR, we assume that a system contains a finite set of serially reusable resources drawn from the set  $\mathcal{R}$ . We also consider set  $\overline{\mathcal{R}}$  that contains, for each  $r \in \mathcal{R}$ , an element  $\overline{r}$ , representing the *failed* resource r. We

write R for  $\mathcal{R} \cup \overline{\mathcal{R}}$ . Actions are constructed as in ACSR, but now can contain both normal and failed resources. So now the action  $\{(r,p)\}$ ,  $r \in \mathcal{R}$ , cannot happen if r has failed. On the other hand, action  $\{(\overline{r},q)\}$  takes place with priority q given that resource r has failed. This construct is useful for specifying recovery from failures.

**Resource Probabilities.** In PACSR we associate each resource with a probability at which the resource may fail. In particular, for all  $r \in \mathcal{R}$  we denote by  $p(r) \in [0,1]$  the probability of resource r being up, while  $p(\overline{r}) = 1 - p(r)$  denotes the probability of r failing. Thus, the behavior of a resource-consuming process has certain probabilistic aspects to it which are reflected in the operational semantics of PACSR. For example, consider the process  $\{(cpu,1)\}$ : NIL, where resource cpu has probability of failure 1/3, i.e.,  $p(\overline{cpu}) = 1/3$ . Then, with probability 2/3, resource cpu is available and thus the process may consume it and become inactive, while with probability 1/3 the resource fails and the process deadlocks.

**Probabilistic Processes.** The syntax of PACSR processes is the same as that of ACSR. The only extension concerns the appearance of failed resources in timed actions. Thus, it is possible on one hand to assign failure probabilities to resources of existing ACSR specifications and perform probabilistic analysis on them, and, on the other hand, to ignore failure probabilities and apply non-probabilistic analysis of PACSR specifications.

#### C. Processes with Dynamic Priorities

ACSR-VP (ACSR with Value Passing) extends the process algebra ACSR by allowing values to be communicated along communication channels. The syntax of ACSR-VP constructs is similar to that ACSR. The semantics of ACSR-VP process is also defined as a labeled transition system, similarly to that of ACSR. It additionally makes use of the following ideas: Process  $(c!e_1, e_2).P$  transmits the value obtained by evaluating expression  $e_1$  along channel c, with priority the value of expression  $e_2$ , and then behaves like P. Process (c?x,p).Preceives a value v from communication channel c and then behaves like P[v/x], that is, P with v substituted for variable x. In the concurrent composition  $(c?x, p_1).P_1 || (c!v, p_2).P_2$ , the two components of the parallel composition may synchronize with each other on channel c resulting in the transmission of value v, producing an event  $(\tau, p_1 + p_2)$ , and leading to process  $P_1[v/x]||P_2.$ 

#### D. Power-aware Processes

An extension of PACSR, called P<sup>2</sup>ACSR, allows us to reason about power-aware processes. In P<sup>2</sup>ACSR, power-aware processes are constructed by the same ACSR operators, but use power-consuming actions instead of timed actions. Every time a resource is accessed, a certain amount of power is consumed.

**Resources and power consumption.** In order to reason about power consumption in distributed settings, the set of resources  $\mathcal{R}$  is partitioned into a finite set of disjoint classes  $\mathcal{R}_i$ , for some index set I. Intuitively, each  $\mathcal{R}_i$  corresponds to a distinct power source which can provide a limited amount

of power at any given time. This limit is denoted by  $c_i$ . Each resource  $r \in \mathcal{R}_i$  consumes a certain amount of power from the source  $\mathcal{R}_i$ . As in PACSR, each resource has a fixed probability of failure in each step.

**Power-consuming timed actions.** As above, a timed action consists of several resources, each resource being used at some priority, and consumes one unit of time. In addition, each resource in an action has some level of power consumption. Formally, an action is a finite set of triples of the form (r, p, c), where r is a resource, p is the priority of the resource usage and c is the rate of power consumption, with the usual restriction that each resource is represented at most once. The additional restriction on an action A is that the total power consumption for any of the resource classes does not exceed the limit of the class:  $\sum_{(r_j, p, c_j) \in A, r_j \in \mathcal{R}_i} c_j \leq c_i$ 

Analysis of power-aware systems. Given a P<sup>2</sup>ACSR process, we can prove that total power consumption in a given behavioral scenario does not exceed some bound. To specify and check such properties, we defined a power-aware temporal logic and a model checking algorithm for it [10]. Given a time frame, we can also compute minimum and maximum power consumption within this time frame.

#### IV. SUMMARY

This tutorial describes a process-algebraic approach to the schedulability and performance analysis problems commonly encountered in the design of embedded systems. In particular, we overview a family of real-time process algebras, ACSR, PACSR, ACSR-VP, and P<sup>2</sup>ACSR, and present a set of illustrative examples.

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# Preemption Threshold Scheduling and Scenario-Based Multithreading of UML-RT Models

Seongsoo Hong, Saehwa Kim, and Michael Buettner

Abstract. We propose a method for schedulability-aware scenario-based multithreading of UML-RT models. Our method provides (1) scenario-based multithreading, (2) model-transformation to support timing and multithread modeling, and **(3)** automated generation of schedulability-guaranteed implementations. Our scenario-based multithreading improves the performance of multithreaded implementations by eliminating blocking due to message passing, and by bounding as once the blocking due to run-to-completion semantics through our use of preemption threshold scheduling. Our model-transformation clearly separates design and implementation since programmers can describe timing requirements and multithreading specification without modifying original models. Finally, our automated generation of schedulability-guaranteed implementations improves programmer efficiency by eliminating the need for tedious fine-tuning.

Index Terms. Object-oriented real-time system design, scenario-based multithreading, model transformation, UML-RT, real-time scheduling, preemption threshold scheduling.

#### I. INTRODUCTION

Real-time embedded systems are becoming increasingly more sophisticated and complex, while at the same time experiencing a shorter time-to-market with greater demands on reliability. As a result, the need for systematic software development methods and tools for real-time embedded systems is now greater than ever. To meet these needs, object-oriented modeling tools have become increasingly popular with real-time embedded systems designers.

However, current modeling tools for object-oriented modeling often lack in providing predictable and verifiable timing behavior and the automatically generated code is not always acceptable. For real-time embedded systems it is of the utmost importance to generate executables that can guarantee timing requirements with limited resources. Currently, designers must map design-level objects to implementation level tasks in an ad-hoc manner. Because

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task derivation has a significant effect on real-time schedulability, tuning the system with this approach is often extremely tedious and time-consuming.

To address these problems, we propose a systematic, schedulability-aware method that maps object-oriented models to multi-threaded implementations in an automated manner. The proposed method uses the notion of scenarios, which can be described as a sequence of events triggered by an incoming external event. With the use of scenarios, timing constraints can easily be defined for end-to-end computations. The proposed method maps mutually exclusive scenarios to logical threads, and assigns each logical thread a priority and preemption threshold that guarantees the schedulability of the whole system. Then, the method groups logical threads into mutually non-preemptive groups, each of which is mapped to a physical thread. Finally, a schedulability-guaranteed implementation is generated. In [1] and [2], the implementation details of this method are presented.

We show that our scenario-based multithreading improves the performance of multithreaded implementations by eliminating blocking due to message passing and by bounding as once the blocking due to run-to-completion semantics through our use of preemption threshold scheduling. While providing these performance benefits, our method clearly separates design and implementation by using intermediate models that leave the original model untouched.

The paper is organized as follows. In Section II we discuss the current multithreading approach, and drawbacks to this approach. Section III presents our method of scenario-based multithreading, model transformation to support timing and multithread modeling, and automated priority and preemption threshold assignment that guarantees the schedulability implementation. The final section concludes the paper.

#### II. CURRENT MULTITHREADING AND ITS DRAWBACKS

#### A. Current Multithreading

The current multithreading method of RoseRT can be summarized as (1) capsule-based multithreading and (2) direct multithreading specification in application models. First, in capsule-based multithreading, all messages associated with each capsule are mapped to a single thread

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and programmers need to assign priorities both to each message and each thread. Second, in direct multithreading specification, programmers can create multithreaded implementations only by directly modifying the structural design and behavioral design models, as stated in the user manual of RoseRT as follows.

If you want a capsule to run in another user-defined thread, you must incarnate that capsule in that thread at run-time. Only optional capsules may be placed on threads other than the MainThread.

#### B. Drawbacks of Capsule-Based Multithreading

Capsule-based multithreading may degrade the performance of real-time systems by extending blocking time unnecessarily. The sources of blocking in capsule-based mapping are (1) two-level scheduling, (2) message sending, and (3) run-to-completion semantics. Blocking due to two-level scheduling occurs when a message is handled by a lower priority thread. Blocking due to inter-thread message passing occurs because the per-thread message queue is accessed by multiple threads. Finally, blocking caused by run-to-completion semantics is due to the synchronization requirements of each state transition of a capsule. This last type of blocking can occur for each instance of inter-thread message passing.

Blocking due to two-level scheduling can be eliminated if thread priorities are dynamically changed according to the priorities of the handled messages, and blocking due to message passing can be bounded as once for each task if IIP (Immediate Priority Inheritance Protocol) is adopted. However, blocking due to run-to-completion semantics can be neither eliminated nor bounded as once in capsule-based multithreading.

#### C. Drawbacks of Direct Multithreading Specification

With direct multi-threading specification, application design models are blurred. Design and implementation are not separated and it is also difficult to recognize implementation models. The process of multithreading specification is also tedious and error-prone.

Moreover, it is hard to specify timing requirements such as deadline and priority. Timing requirements should be specified in units of end-to-end computation. However, the UML-RT meta-model does not contain end-to-end computations as a modeling entity

#### III. PROPOSED METHOD

Our goals are to propose (1) a multithreaded implementation method that can minimize unnecessary blocking, (2) a model transformation method, and (3) a method that can automatically generate schedulability-guaranteed implementations based on given timing modeling specifications. To achieve these goals, we propose the following:

#### 1) Scenario-based multithreading:

We map all events in a scenario to a single thread. A scenario is a sequence of actions triggered by an external event.

2) Model Transformation to Support Timing and

Multithread Modeling:

Instead of direct mapping, our tools provide intermediate models such as scenario models and thread models. Programmers can specify timing requirements such as deadline and priority to scenarios, which represent end-to-end computations.

3) Automated assignment of priority and preemption threshold to threads:

We provide algorithms for assigning a priority and a preemption threshold that guarantee the schedulability of a given task set. This frees programmers from the need to perform repetitive fine-tuning.

#### A. Scenario-Based Multithreading

Figure 1 shows an example execution of scenario-based multithreading. In Figure 1, each capsule is represented by a finite state machine and Ox: Ay represents action y of capsule x. In capsule-based multithreading, all actions O1:A0, O1:A1, and O1:A2 should execute in one thread. However, in scenario-based multithreading, each action can execute in a different thread: O1:A0 in the main thread, O1:A1 in thread1, and O1:A2 in thread2. In this example, O1:A1 sends a message to a port contained in capsule role O2 and this message triggers O2:A2. This means these two actions O1:A1 and O2:A2 compose one scenario. In capsule-based multithreading, these actions should execute in different threads since they belong to different capsule roles. In contrast, in scenario-based multithreading all actions contained in the same scenario execute in the same thread. This eliminates unnecessary blocking time. One thread can execute multiple scenarios and the priority of a thread changes dynamically according to the priority of the executing scenario.

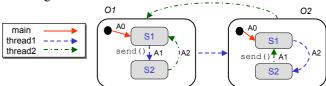


Fig. 1. Execution model of scenario-based multithreading.

The main concerns in designing a run-time system to support such scenario-based multithreading are (1) scenario-aware message passing and (2) satisfying run-to-completion semantics. For scenario-aware message passing, we added attributes representing a scenario to the class for external messages; the target thread id, the priority, and the preemption threshold of the scenario. The message sending functions insert messages into the message queue of the target thread. In [2], the details of this implementation are presented.

To satisfy run-to-completion semantics, we use a mutex for each capsule state transition. For real-time synchronization we use IIP (immediate inheritance protocol) under PTS with priority ceilings. With this, a scenario can block only once before it starts its execution. For further analysis of IIP under PTS with priority ceilings, please refer to [3].

# B. Model Transformation to Support Timing and Multithread Modeling

Figure 2 shows the overview of our model transformation method that is a three-step process: transforming a UML-RT model to (1) a scenario model, (2) a logical thread model, and (3) a physical thread model. The first step derives scenarios from a given design model. The second step groups mutually non-concurrent scenarios and merges them into a single task to transform the scenario model to a logical thread model. This step also assigns each task an appropriate priority and preemption threshold that guarantees schedulability of the task set. We refer to this task as a logical thread to differentiate it from a physical thread that actually comprises a final implementation. The final step merges logical threads into non-preemptive groups according to their priorities and preemption thresholds. Each non-preemptive group becomes a physical thread.

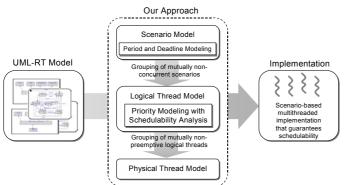


Fig. 2. The overview of model transformation.

#### 1) Scenario model

A scenario model is created from a given UML-RT design model. To derive a scenario model, our method first identifies scenario initiation points or initial scenario transitions, which are transitions that handle external events. External events are messages delivered from service provision ports (SPPs) or unpublished wireless ports. Timer is a representative example of an SPP. Scenario initiation points are represented as a set of capsule role, port, signal, and transition as in Figure 3.



Fig. 3. A scenario model: a text file containing this entry is generated.

Users may need to track the execution path of a scenario, and for this purpose scenario models can be represented as an AND-OR action tree like Figure 4. In Figure 4, Ox:Ay represents action y of capsule x. A node denotes either an action or a conjunction or disjunction of messages, and an edge denotes message flow. Action nodes are classified into SINGLE-Action, AND-Action, OR-action, and LEAF-Action nodes. An AND-Action must send out all of its outgoing messages in the left-to-right order. An OR-Action sends only one of its outgoing messages depending on the condition within the action. A LEAF-Action does not possess any outgoing messages. When an action has nested

conjunctions or disjunctions among its outgoing messages, bridge nodes are used. They are classified into AND-bridge and OR-bridge nodes.

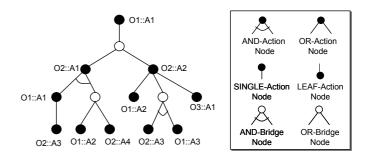


Fig. 4. An example AND-OR action tree.

#### 2) Logical thread model

A logical thread model is created from a given scenario model and is represented as a text file containing entries as in Figure 5. Transformation to a logical thread model is composed of (1) grouping of mutually non-concurrent scenarios, (2) assigning a priority to each logical thread, and (3) assigning a preemption threshold to each physical thread. Mutually non-concurrent scenarios are such scenarios that cannot run concurrently. For example, in a cruise control system a scenario that starts from "start cruise mode" and a scenario that starts from "start manual mode" do not run concurrently. The results of this grouping are shown as a generated logical thread model and users can refine this.

Logical	Priority	Preemption	List of Scenarios		
Thread Id	Filolity	Threshold	(Non-concurrent group)		

Fig. 5. A logical thread model: a text file with this entry is generated.

At run-time, a logical thread may have multiple periods, worst-case execution times, and run-to-completion blocking times since a logical thread may be a collection of scenarios. Our method can automatically assign the logical threads priorities and preemption thresholds that guarantee the schedulability of the task set. We present the algorithms for this automated priority assignment in the next section. Alternatively, users can assign logical thread priorities and preemption thresholds, or assign some subset of priorities and preemption thresholds and let our method assign the remaining priorities and preemption.

#### 3) Physical thread model

A physical thread model is created from a logical thread model and is represented as a text file containing entries as in Figure 6, and users are able to refine this model. Logical threads can be further aggregated into a non-preemptive group where every possible pair is mutually non-preemptive. Two logical threads  $L_i$  and  $L_j$  are mutually non-preemptive if  $\pi(L_i) \geq \gamma(L_j)$  and  $\pi(L_j) \geq \gamma(L_i)$ , using the notation found in Table 1. With this relationship, we can easily construct non-preemptive groups of logical threads. We can directly map a non-preemptive group to a physical thread. This can significantly reduce the number of threads, thus reducing context switching overhead and static memory resource demands.

Physical	List of Logical Threads				
Thread Id	(Mutually non-preemptive group)				

Fig. 6. A physical thread model: a text file with this entry is generated.

## C. Automated Priority and Preemption Threshold Assignment

For feasible priority assignment, our method adopts Audsley's algorithm. For schedulability testing, our method uses response time analysis. Considering that logical threads have multiple scheduling attributes, our method extended existing response time analysis as follows according to the notations of Table 1.

Table 1. Notations for describing response time analysis algorithms.

Notation	Description				
$L_i$	A logical thread				
$ au_i$	A scenario				
$z^i_{\ i}$	A scenario mapped to logical thread $L_j$				
$A^{j}{}_{i}$	An action composing scenario $\tau_j$				
$O(A^{j}_{i})$	A capsule that contains action $A^{i}_{i}$				
$C(\tau_i)$	The worst-case execution time of scenario $\tau_i$				
$T( au_i)$	The period of scenario $\tau_i$				
$eta( au_i)$	The blocking time of scenario $\tau_i$				
$\pi(X)$	The fixed-priority of $X$ that may be either scenario $\tau_i$ or				
$\mathcal{H}(A)$	logical thread $L_i$				
γ(X)	The preemption threshold of $X$ that may be either scenario				
$\gamma(\Lambda)$	$ au_i$ or logical thread $L_i$				
$B(L_i)$	The blocking time of logical thread $L_i$ due to preemption				
D(L)	threshold scheduling				
$S(L_i)$	The start time of logical thread $L_i$				
$F(L_i)$	The finish time of logical thread $L_i$				
$R(L_i)$	The response time of logical thread $L_i$				

$$\begin{split} \beta(\tau_i) &= \max_{\substack{l: \pi(\tau_i) < \pi(\tau_i), \\ h: \pi(\tau_k) \geq \pi(\tau_i)}} \left\{ \max_{k, m} \left\{ C(A_k^l) :: O(A_k^l) = O(A_m^h) \right\} \right\} \\ R(L_i) &= \max_j \left\{ \beta(\tau_j^i) + C(\tau_j^i) \right\} + \\ &\sum_{\forall j} \max_k \left\{ \left\lceil \frac{R(L_i)}{T(\tau_k^j)} \right\rceil \cdot C(\tau_k^j) \right\} \end{split}$$

The higher the preemption threshold a task has, the lower number of context switches the task will incur. Therefore, our method assigns each logical thread the maximum possible preemption threshold. Our algorithm for assigning maximum preemption thresholds exploits the method presented in [4]. The response time analysis algorithm for logical threads with assigned preemption thresholds is as follows.

$$\begin{split} B(L_i) &= \max_{j,k} \left\{ C(\tau_k^j) :: \gamma(L_j) \geq \pi(L_i) > \pi(L_j) \right\} \\ S(L_i) &= \max \left\{ B(L_i), \max_j \beta(\tau_j^i) \right\} + \\ &\sum_{\substack{\forall j, i \neq j \\ k \neq j, l \neq$$

$$R(L_{i}) = F(L_{i}) = S(L_{i}) + \max_{j} \left\{ C(\tau_{j}^{i}) \right\} + \sum_{\substack{\forall j \\ \pi(L_{i}) > \gamma(L_{i})}} \max_{k} \left\{ \left\{ \left\lceil \frac{F(L_{i})}{T(\tau_{k}^{j})} \right\rceil - \left(1 + \left\lfloor \frac{S(L_{i})}{T(\tau_{k}^{j})} \right\rfloor \right) \right\} \cdot C(\tau_{k}^{j}) \right\}$$

#### IV. CONCLUSION

We have proposed a method for schedulability-aware scenario-based multithreading for UML-RT models. Using our method it is possible to easily define timing requirements for an end-to-end computation and automatically generate a schedulability-guaranteed implementation.

Our scenario-based multithreading outperforms capsule-based multithreading because scenario-based multithreading (1) eliminates the blocking due to message passing that cannot be avoided in capsule-based multithreading and (2) our preemption threshold scheduling bounds as once the blocking due to run-to-completion. Please refer to [2] for our experimental results.

While enhancing the performance of multithreaded models, our model transformation also eliminates the mix of implementation and design that is present in the current RoseRT tool. Our method also enables programmers to specify timing requirements such as deadline and priority without modifying original models.

Also, our method automatically generates implementations that guarantee schedulability. With this, programmers do not need to generate implementations repeatedly or perform tedious fine-tuning.

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