## **Cycle-Accurate Virtual Prototyping with Multiplicity**

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Abstract: Model-based design for large applications, especially the mapping of applications' tasks to execution nodes,

remains a challenge. In this paper, we explore applications comprising multiple identical software tasks intended for deployment across diverse execution nodes. While these tasks are expected to have a unified representation in their SysML-like block diagrams, each must be specifically mapped to individual processor cores to achieve granular performance optimization. Additionally, inter-task communications should be allocated across multiple channels. We further demonstrate a method for automatically generating parallel POSIX C code suitable for a multiprocessor-on-chip. Our approach has proven especially effective for high-performance

streaming applications, notably when such applications have a master-worker task structure.

## 1 INTRODUCTION

As shown by (Burch et al., 2002), designing embedded applications at different abstraction levels helps verifying the correctness of the system. In this paper, we design embedded application at a high abstraction level, thus pushing forward hardware constraints to modeling refinements. Many tools propose the possibility to express the multiplicity of tasks and channels, but lack the possibility to map them to multiprocessor platforms, with the idea of exploring diverse mapping alternatives (a.k.a. design space exploration). Pushing the problem even further, task-farm parallelism, that can be found in high performance telecommunication and video streaming applications, usually results in a huge number of tasks. Applications consist of alternating levels of producer and consumer tasks, each consumer task waiting for data produced by any one of the producer tasks.

Our tool (Apvrille, 2023) offers a comprehensive multi-level modeling and prototyping environment, initiating from levels akin to SysML. The work in (Li et al., 2018) extended its capabilities, facilitating code generation down to the SystemC virtual prototype, which is constructed using cycle-accurate models of the hardware components. This enhancement enables highly detailed simulations. Nonetheless, a notable drawback is that every task must be explicitly delineated in the block diagram, rendering the design space exploration process to be somewhat tedious.

The paper defines a process to efficiently represent applications with numerous tasks and channels in

SysML block diagrams and subsequently the efficient allocation of these tasks and channels to a specific hardware platform. This hardware platform acts as an input model, facilitating the generation of a cycle-accurate virtual prototype. Such a prototype enables precise simulations to determine optimal task deployment. Consequently, our extension paves the way for a more comprehensive modeling of multi-task applications and their deployment on multi-core platforms.

After discussing related work in Section 2, we introduce the underlying concepts (Model-based engineering, applications with many tasks) in Section 3. Our contribution is described in Section 4 with a toy system, and applied to a larger case study in Section 5 before we conclude.

### 2 RELATED WORK

Many system-level design approaches exist, with the majority permitting multiple application tasks and their allocation to virtual prototypes of multiprocessor platforms. Few however propose several levels of simulation, or even lower the simulation level to be cycle precise.

The ARTEMIS (Pimentel et al., 2001) project originates from heterogeneous platforms in the context of research on multimedia applications in particular. Application and architecture are clearly separated: the application produces an event trace at simulation time, which is then read in by the architecture model. However, low-level behavior depending

on timers and interrupts cannot be taken into account.

Sesame (Erbas et al., 2006) proposes modeling and simulation features at several abstraction levels. Pre-existing virtual components are combined to form a complex hardware architecture. Models' semantics vary according to the levels of abstraction, ranging from Kahn process networks (KPN (Kahn, 1974)) to data flow for model refinement, and to discrete events for simulation. Sesame models consider neither memory mapping nor the choice of the communication architecture.

(Di Natale et al., 2014) proposes the generation of communication managers for software low layers of telecommunication applications. Yet, they do not handle task-farm type applications, nor do they offer formal verification.

(Batori et al., 2007) proposes a design methodology specifically for task parallel telecommunication applications, using several formalisms to capture the application structure. Behavior is described as Finite State Machines, then a deployment is found from which executable code can be generated. The platform is limited by its specificity and no design exploration seems possible; code generation targets a real platform instead of a prototyping environment.

UML/SysML based modeling techniques are very popular in embedded system design. MARTE (Vidal et al., 2009) separates communications from the pair application-architecture, but intrinsically lacks separation between control aspects and message exchanges. Even if the UML profile for MARTE adds capabilities to model Real Time and Embedded Systems, it does not specifically support architectural exploration. These approaches are however scarcely used for low-level simulation. With very few exceptions such as (Taha et al., 2010), they do not support full-system simulation. The work presented in (Revol et al., 2008) supports generation of IP-XACT models.

### 3 BASIC CONCEPTS

### 3.1 Model-Based Engineering

Model-based engineering of embedded systems can be performed at different abstraction levels, commonly grouped into two subsets: *functional* and *partitioning* (high level), *software design* and *deployment* (low level). Specific SysML views and diagrams can be used for each abstraction level (e.g., block diagrams, use of allocations). Software and hardware tasks to be partitioned are first captured within the functional abstraction level. Then, functions and

their communications are mapped to abstract hardware components.

After partitioning, software tasks can be further detailed and then deployed on more concrete hardware components. Thus, software deployment intends to experiment the interaction of software with all other components (digital and analog).

#### 3.2 Master-Worker Paradigm

In embedded systems, communications predominantly take a one-to-one scheme, with one-to-many used for *broadcast* communications. In contrast, high-performance streaming applications often feature many-to-many communications. Among various parallel computing paradigms (Barney et al., 2010), master-worker is particularly suitable for massively parallel applications.

This pattern is especially prevalent in *task farm* applications, where multiple producer tasks interact with multiple consumer tasks. However, a notable drawback is the need to model each task individually, which becomes cumbersome when modeling a large number of tasks with identical functionalities.

#### 3.3 NUMA Architectures

Non Uniform Memory Access (NUMA) is a design scheme for massively parallel hardware designs, such as the ones used for high performance streaming applications. Memories are separated and placed at different locations: this splitting of memories leads to different access times to memories and may lead to access conflicts as well, particularly in MP-SoC based on clustered on-chip interconnects. Latency and conflicts lead to possible extra waiting time for new data reaching the system and to buffer overflows. In such NUMA systems, the correct mapping of tasks to processors is therefore challenging, especially when a huge number of tasks is considered.

#### 3.4 Method

Figure 1 shows the overall method on which our contribution relies. This Figure features the different modeling phases of the design process, and the evaluation of the different models with simulation and formal verification.

On the partitioning level, functionality is described with SysML-like diagrams, and a C++ simulation from partitioning model helps taking allocation decisions. On software design level, formal verification intends to evaluate safety and security properties,

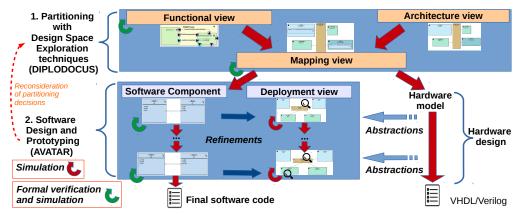


Figure 1: Methodology (from (Li et al., 2018)).

and a virtual prototype can then be generated for more refined performance evaluation.

Our improved method relies on a set of UM-L/SysML views supported within the same toolkit, TTool (Apvrille, 2023). The method is as follows:

- Hardware/software partitioning based on design space exploration techniques contains three subphases: modeling of the functions to be realized by the system ("functional view"), modeling of the candidate architecture ("architecture view"), and mapping ("mapping view"). A function mapped onto a processor is thus implemented as a software function, a function mapped onto a hardware accelerator corresponds to a custom Application Specific Integrated Circuit (ASIC). At this stage, we are mostly concerned with how communications and function affect the performance of a mapping. Logical communication between functions are mapped on a "communication path" consisting of buses, bridges, memories, etc.
- 2. Once the system is fully partitioned, the software and the hardware are designed using the AVATAR environment (Pedroza et al., 2011). This approach offers software modeling while taking into account hardware parameters. A software component view is used to build the system software architecture and behavior, a deployment view shows how software components are mapped to the hardware components. The model of software and hardware components is progressively refined, the most refined model serves to generate a virtual prototype consisting of hardware models described in SystemC and software in the form of C POSIX tasks.

# 3.5 Simulation, Verification and Prototyping

The toolkit offers a press-button approach for performing safety and security proofs by simulation and formal verification. It also checks if performance requirements are met. Model transformations translate the SysML models into an intermediate form that is sent to the underlying simulation and formal verification toolkits - some of them third party.

While during functional modeling, not considered in this paper, formal verification aims at identifying general safety properties (e.g., absence of deadlock situations), in the software design and mapping phase, verification intends to check if performance and security requirements are met. Hardware components are still abstracted, e.g., a CPU is defined with a set of parameters such as cache-miss ratio, context switch penalty, etc.

When the software components are more refined, it becomes important to evaluate performance. Since the target system is commonly not yet available, our approach offers a deployment view in which software components can be mapped onto hardware nodes, and a press-button approach to transform the deployment diagram into a specification built upon virtual component models using a free SystemC library called SoCLib (SoCLib consortium, 2016). SoCLib is a public domain library of models written in SystemC, targeting shared-memory architectures. SoCLib contains a set of performance evaluation tools for level simulation which allow to measure cache miss rate, latency of memory accesses and the fill state of the buffers, taking/releasing of locks etc. on a cycleprecise level. Note that on this level, the approaches is purely based on simulating on the virtual prototype and it is no more possible to formally verify, due to high complexity and level of detail.

The method described in (Li et al., 2018) and

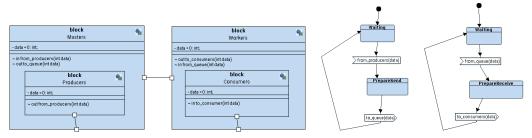


Figure 2: Masters and Workers block diagram (left) and state machines (right) using multiplicity.

shown in Figure 1 implies that if these performance results differ too much from the results obtained during the design space exploration stage, the design space exploration must be performed again Once the iterations over the high-level design space exploration and the low level virtual prototyping of software components finished, software code can be generated from the most refined software model.

#### 4 CONTRIBUTION

The present paper proposes an extension of the high-level modeling capabilities of TTool (Apvrille et al., 2006) with multiple parallel tasks. For this, we need to extend the notion of the SysML *Block Diagram* to represent multiple, identical blocks.

#### 4.1 Modeling

From a SysML point of view, block definition and internal block diagrams are used to capture functions and architectural components. An additional parameter now allows to define the number of identical instances. Blocks that are thus replicated share the same definition and behavior. In the example of Figure 2 we have identical instances of the *Producers* sub task.

When the origin or destination task of a channel is replicated, the channel has to be replicated too, or one channel is shared between several origin or several destination tasks, or any combination depending on the task and channels allocation and replication scheme selected by the user. Here, we choose to replicate the channel to correspond to the number of tasks. Alternatively, one channel could be shared between all tasks, or any combination of groups of tasks reading from/writing to a common channel.

This new freedom has consequences on the state machine diagrams. Identical tasks communicating through identical channels share the same state machine diagram. Their channels will be considered to be *multicast* channels. For all other replication schemes, we currently propose one state machine per

block.

#### 4.2 Mapping

Using a deployment diagram where tasks and channels are allocated to processors and memory, respectively, our tool is capable of generating a parallel hardware platform suitable for virtual prototyping. Tasks allocated to a processor are implemented in software, while those designated to a hardware accelerator or FPGA in hardware. Several tasks can share a node in CPUs or FPGAs, whereas a hardware accelerator can accommodate only a single task. Simulating these mapping models provides valuable insights into system performance.

Functional channels must be mapped as well. When their origin or destination task is replicated, they must be replicated too, or shared between the tasks, or any combination depending on the task and channels allocation and replication scheme selected by the user.

Blocks (called *block artifacts* in the deployment view) are mapped onto CPUs using a pull-down menu. Identical blocks are not automatically mapped to the same processor, a design decision which accepts by doing so that mapping of dozens of blocks individually is a little cumbersome. Still, it requires only a few mouse clicks.

Now, we can express the master-worker paradigm defined in Section 3.2 in a compact way, see Figure 2. Note that multiplicity can be parameterized by modifying one parameter in the block diagram.

# **4.3** Code Generation and Virtual Prototype

Multicast channels are naturally translated into the Multiple Writer/Multiple Reader (MWMR) channels of SoCLib. Mapped to memory, they have a complex access scheme (Genius et al., 2011), but correspond best to the master/worker paradigm where every master deposes work to a common channel, which is fetched by any worker, without an order to be re-

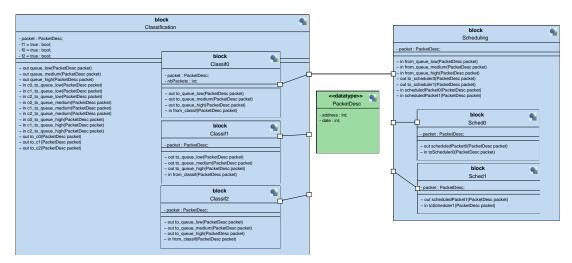


Figure 3: Block diagram of the classification application without multiplicity.

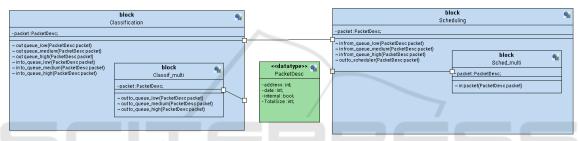


Figure 4: Block Diagram of the classification application featuring multiple blocks and channels.

spected except FIFO. Generated code will be run on the SoCLib platform under a micro kernel, C POSIX threads being created for each of the tasks.

#### 5 CASE STUDY

The following case study illustrates the additional features we propose for handling applications with many similar tasks. Note that it is not limited, but most relevant, to task-farm type parallel applications. A telecommunication application modeled in SysML in (Genius et al., 2019) serves as case study; it could initially only handle a fixed number of tasks for both the classifier and the scheduler stages.

All tasks of a stage n can read the data output by all tasks of stage n-1. Basically, the application first cuts network packets into chunks of equal size carrying *descriptors* referencing the address of the next chunk. A packet chunk contains a 32-bit address, then 11 bits for the *TotalSize*, then 20 bits *date* for a time stamp, and finally an *internal boolean* indicating if the packet is stored on-chip or off-chip, for a total of 64 bits. Only descriptors are sent through the channels: indeed, packet data are kept in on-chip or off-

chip memories while being routed. For the sake of simplicity, I/O co-processors are not modeled. Thus, tasks part of the current case study are:

- The Classification tasks read one or several descriptors at a time, then retrieve the first chunk of the corresponding packet from memory. Any classification task can access any chunk. Inner classifier tasks determine the priority of each packet.
- The *Scheduling tasks* read one of the priority queues according to their order, then write descriptor to an output. The inner scheduler tasks schedule the packet, based on its priority.

In order to maximize performance, both classification and scheduling tasks use *try-read* primitives to start work whenever data is available. We do not consider I/O and bootstrap tasks in this case study.

#### 5.1 Block Diagram

Figure 3 shows the simplified AVATAR block diagram of the original telecommunication application, without the I/O mechanisms. This software architecture shows refined elements such as the data structure PacketDesc defined as a data type which is exchanged

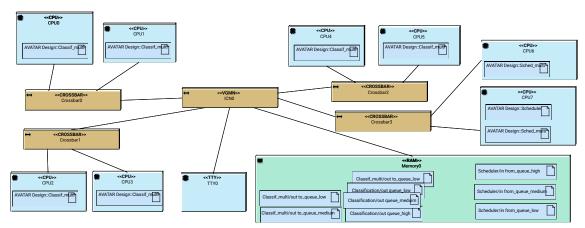


Figure 5: Deployment Diagram for the telecommunication application (6 classification, 2 scheduling tasks).

via channels. The software application model features three classification tasks and two scheduling tasks and has to be rewritten, including the state machines, every time more tasks are to be added. The relatively low number of tasks was due to former limitations of the graphical SysML-like representation: diagrams could not yet express replication of identical tasks (i.e., multiplicity) and all diagrams and state machines had to be designed manually for replication.

The main communication channel is defined between Classification and Scheduling. It conveys three *signals* that correspond to the three priority queues. Each priority queue (*high*, *medium*, *low*) is meant to be transformed into a separate multi-writer multi-reader channel in the SoCLib-based virtual platform. The priority queues are modeled as asynchronous channels, with a depth of 1024 descriptors.

Figure 4 shows the rewritten version of the application, now featuring multiple blocks. Task-farm parallelism can be conveniently captured using non-deterministic choice in the state machines (not shown for lack of space). The scheduling task which takes as input available data in the priority queues are modeled in a similar way. An outer task coordinates the reading from the priority queues and the writing to the output channel.

### 5.2 Mapping

The application is deployed on a clustered platform. The generated virtual prototype supports a highly realistic model of NUMA architectures as explained in section 3.3; non-uniform memory access effects such as increased latency due to competition for the interconnect, and buffer overflow caused by a large number of tasks writing to the same multi-writer channel without sufficient reads are acerbated by an increasing number of tasks (up to eighty classification tasks

were employed in a study shown in (Genius et al., 2011)). The AVATAR deployment diagram in Figure 5 illustrates one possible task and channel mapping on a clustered NUMA platform.

### **5.3** Experimental Results

The two critical parameters that warrant exploration for telecommunication and general streaming applications are latency and channel fill state. Latency refers to the duration, measured in simulation cycles, that a packet descriptor requires to complete an end-to-end traversal. Channel fill state, on the other hand, pertains to the quantity of packet descriptors populating the priority queues within a specified time interval.

#### 5.3.1 Latencies

It is well known that low memory access latencies are of critical importance for fast packet routing. However, clustered multiprocessor platforms, often used to run these applications, usually suffer a high standard deviation for these latencies with regards to more common platforms (Nikolov et al., 2008). Channels are stored in memory, and the communications via these channels represent a high fraction of the application activity as shown in an initial C implementation (Genius et al., 2011). The higher the number of tasks accessing a channel, the higher the amount of time spent waiting for the lock in order to access concerned the memory bank.

Figure 7.(a) shows the mean latencies, assuming three priority queues (high, medium, low) and a ratio of 3 to 1 (rounded downwards) between classification and scheduler tasks. Results are still only partially comparable to the implementation in C, as we did not model packet memory accesses and I/O, but in contrast to former work we can now vary the number of tasks by simple change of a parameter. In the

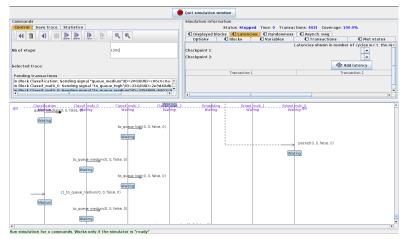


Figure 6: Interactive simulation on software design level.

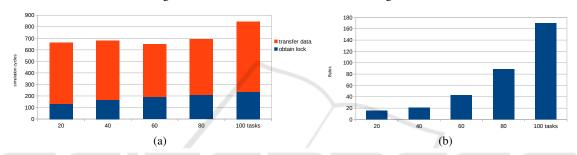


Figure 7: Mean latency (a) and fill state (b) per channel for 3 priority queues and a varying number of classification tasks.

first SysML version (Genius et al., 2019), only one instance featuring three classification tasks and two scheduling tasks was modeled.

SoCLib groups of classification and scheduling tasks, connected by groups of channels, can be mapped together on a cluster, in order to fine-tune performance.

#### 5.3.2 Throughput

We keep track of the channel fill state using a Python script and the SoCLib VCI logger. In our example, we do not fix an input frequency; addresses are read as soon as they are available and we assume that channels are never full: the channels were setup to hold 128 descriptors (1024 bytes). Figure 7.(b) shows the mean fill state of the channels representing the priority queues, again for three priority queues and a ratio of 3 to 1 (rounded downwards) between classification and scheduler tasks. Figure 6 shows an extract of an interactive simulation of C Posix code on software design level, referring to the determination of latencies.

### **5.3.3** Design Space Exploration

The application is now easily scalable by simple modification in the multiplicity menu. At the price of placing tasks individually on processors in the Deployment Diagram, more fine-tuning becomes possible. As in the original C code version of (Genius et al., 2011), which uses the same virtual platform

## 6 DISCUSSION AND FUTURE WORK

By representing multiple identical tasks, and allowing multiplicity of channels, we significantly facilitate the design space exploration for task farm type applications. The generated virtual prototype is very detailed, making it particularly well adapted for fine grain performance analysis and tuning.

It should be noted that the extension is useful for the larger class of applications featuring multiple identical tasks running in parallel, but only task farm type applications fully exploit the potential of multi writer multi reader channels.

Requiring individual state machines for multiple blocks unless connected by channel replicated in the same way is still time-consuming. It would be useful to develop communications schemes similar to the Psi-Chart (Enrici et al., 2017) for the functional level.

Cycle-accurate models are precise, but slow to simulate – minutes to hours, depending on the number

of tasks and processors. We are currently working on the integration of transaction-level and Qemu-based virtual platforms.

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