# Design Optimization of Multi-Cluster Embedded Systems for Real-Time Applications

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## Abstract

We present an approach to design optimization of multi-cluster embedded systems consisting of time-triggered and event-triggered clusters, interconnected via gateways. In this paper, we address design problems which are characteristic to multi-clusters: partitioning of the system functionality into time-triggered and event-triggered domains, process mapping, and the optimization of parameters corresponding to the communication protocol. We present several heuristics for solving these problems. Our heuristics are able to find schedulable implementations under limited resources, achieving an efficient utilization of the system. The developed algorithms are evaluated using extensive experiments and a real-life example.

## **1. Introduction**

An increasing number of real-time applications are today implemented using distributed architectures consisting of interconnected clusters of processors. Each such cluster has its own communication protocol and two clusters communicate via a *gateway*, a node connected to both of them. This type of architectures is used in several application areas: vehicles, factory systems, networks on chip, etc.

Considering, for example, the automotive industry, the way functionality has been distributed on an architecture has evolved over time. Initially, each function was running on a dedicated hardware component. However, in order to use the resources more efficiently and reduce costs, several functions have been integrated in one node and, at the same time, certain functionality has been distributed over several nodes (see Figure 1). Although an application is typically distributed over one single cluster, we begin to see applications that are distributed across several clusters, as illustrated in Figure 1 where the application represented as black dots, is distributed over the two clusters. This trend is driven by the need to further reduce costs, improve resource usage, but also by application constraints like having to be physically close to particular sensors and actuators. Moreover, not only are these applications distributed across networks, but their functions can exchange critical information through the gateway nodes.

Researchers have often ignored or very much simplified aspects concerning the communication infrastructure. One typical approach is to consider communications as processes with a given execution time (depending on the amount of information exchanged) and to schedule them as any other process, without considering issues like communication protocol, bus arbitration, packaging of messages, clock synchronization, etc. [14].

Many efforts dedicated to communication synthesis have concentrated on the synthesis support for the communication infrastructure but without considering hard real-time constraints and system level scheduling aspects [4, 15]. We have to mention here some results obtained in extending real-time schedulability analysis so that network communication aspects can be handled. In [11], for example, the controller area network (CAN) protocol is investigated while the work reported in [12] deals with a simple time-division multiple access (TDMA) protocol.

There are two basic approaches for handling tasks in real-time applications [6]. In the *event-triggered* approach (ET), activities are initiated whenever a particular event is noted. In the *time-triggered* (TT) approach, activities are initiated at predetermined points in time. There has been a long debate in the real-time and embedded systems communities concerning the advantages of TT and ET approaches [1, 6, 13]. An interesting comparison, from a more in-1530-1591/04 \$20.00 (c) 2004 IEEE <sup>2</sup> {magnus.hellring|olof.bridal } @volvo.com Dept. of Electronics and Software Volvo Technology Corporation SE-405 08 Göteborg, Sweden

dustrial, in particular automotive, perspective, can be found in [7]. The conclusion there is that one has to choose the right approach depending on the particularities of the processes. This means not only that there is no single "best" approach to be used, but also that inside a certain application the two approaches can be used together, some processes being TT and others ET.

In [8] we have addressed design problems for systems where the TT and ET activities *share the same* processor and bus. A fundamentally different architectural approach to heterogeneous TT/ET systems is that of heterogeneous multi-clusters, where each cluster can be either TT or ET:

- In a *time-triggered cluster* (TTC) processes and messages are scheduled according to a static cyclic policy, with the bus implementing a TDMA protocol such as, for example, the time-triggered protocol (TTP) [6].
- On *event-triggered clusters* (ETC) the processes are scheduled according to a priority based preemptive approach, while messages are transmitted using the priority-based CAN bus [2].

In this context, in [9] we have proposed an approach to schedulability analysis for multi-cluster distributed embedded systems. Starting from such an analysis, this paper is the first one to address specific design issues for multi-cluster systems. The proposed approaches solve the problems of partitioning an application between the TT and ET clusters, mapping the functionality of the application on the heterogeneous nodes of a cluster and adjusting the parameters of the communication protocols such that the timing constraints of the final implementation are guaranteed.

The paper is organized in 7 sections. The next section presents the application model as well as the hardware and software architecture of our systems. Section 3 presents the design optimization problems we are addressing in this paper, and section 4 presents our proposed heuristics for the design optimization of multi-cluster systems. The last two sections present the experimental results and conclusions.

# 2. Application Model and System Architecture 2.1 System Architecture

We consider architectures consisting of two interconnected clusters (see Figure 1). A *cluster* is composed of nodes which share a broadcast communication channel. Let  $\mathcal{N}_T(\mathcal{N}_E)$  be the set of nodes on the TTC (ETC). Every *node*  $N_i \in \mathcal{N}_T \cup \mathcal{N}_E$  consists, among others, of a communication controller and a CPU. The gateway node  $N_G$  connected to both types of clusters, has two communication controllers, for TTP and CAN. The communication controllers implement the protocol services and run independently of the node's CPU.

Communication between the nodes on a TTC is based on the TTP [6]. The bus access scheme is TDMA, where each node  $N_i$ , including the gateway node, can transmit only during a predetermined time interval, the so called TDMA slot  $S_i$ . In such a slot, a node can send several messages



Figure 1. A System Architecture Example

packed in a frame. A sequence of slots corresponding to all the nodes in the TTC is called a TDMA round. A node can have only one slot in a TDMA round. Several TDMA rounds can be combined together in a cycle that is repeated periodically. The TDMA access scheme is imposed by a message descriptor list (MEDL) that is located in every TTP controller. The MEDL serves as a schedule table for the TTP controller which has to know when to send/receive a frame to/from the communication channel.

On an ETC the CAN [2] protocol is used for communication. The CAN bus is a priority bus that employs a collision avoidance mechanism, whereby the node that transmits the message with the highest priority wins the contention. Message priorities are unique and are encoded in the frame identifiers, which are the first bits to be transmitted on the bus.

Throughout the paper we will use the notation  $\mathcal{B} = \langle \beta, \pi \rangle$  to denote a certain communication configuration consisting of the sequence and size of the slots in a TDMA round on the TTC ( $\beta$ ) and the priorities of the messages on the ETC ( $\pi$ ).

We have designed a software architecture which runs on the CPU in each node, and which has a real-time kernel as its main component. A real-time kernel is responsible for activation of processes and transmission of messages on each node. On a TTC, the processes are activated based on the local schedule tables, and messages are transmitted according to the MEDL. On an ETC, we have a scheduler that decides on activation of ready processes and transmission of messages, based on their priorities. For more details about the software architecture and the message passing mechanism the reader is referred to [9].

The approaches presented in this paper can be easily extended to cluster configurations where there are several ETCs and TTCs interconnected by gateways.

## 2.2 Application Model

We model an application  $\Gamma$  as a set of directed, acyclic, polar graphs  $G_i(V, E) \in \Gamma$ . Each node  $P_i \in V$  represents one process. An edge  $e_{ij} \in E$  from  $P_i$  to  $P_j$  indicates that this output of  $P_i$  is an input to  $P_j$ . A process can be activated after all its inputs have arrived and it issues its outputs when it terminates. The communication time between processes mapped on the same processor is considered to be part of the process worst-case execution time and is not modeled explicitly. Communication between processes mapped to different processors is performed by message passing over the buses and, if needed, through the gateway. Such message passing is modeled as a communication process.

The mapping of a process graph G(V, E) is given by a function  $M: V \to \mathcal{N}_{e}$ where  $\mathcal{N}_{e} = \mathcal{N}_{T} \cup \mathcal{N}_{E}$  is the set of nodes in the architecture. For a process  $P_{i} \in V, M(P_{i})$  is the node to which  $P_{i}$  is assigned for execution. Each process  $P_{i}$  can potentially be mapped on several nodes. Let  $\mathcal{N}_{P_{i}} \subseteq \mathcal{N}_{e}$  be the set of nodes to which  $P_{i}$  can potentially be mapped. We consider that for each  $N_{k} \in \mathcal{N}_{P_{i}}$ , we know the worst-case execution time<sup>1</sup>  $C_{P_{i}}^{N_{k}}$  of process  $P_{i}$ , when executed on  $N_{k}$ . We also consider that the size of the messages is given.

Processes and messages activated based on events also have a uniquely assigned priority,  $p_{P_i}$  for processes and  $p_{m_i}$  for messages.

All processes and messages belonging to a process graph  $G_i$  have the same period  $T_i = T_{G_i}$  which is the period of the process graph. A deadline  $D_{G_i} \leq T_{G_i}$  is imposed on each process graph  $G_i$ . In addition, processes can have associated individual release times and deadlines. If communicating processes are of different periods, they are combined into a hyper-graph capturing all process activations for the hyper-period (LCM of all periods).

## **3. Design Optimization Problems**

Considering the type of applications and systems described in section 2, and using the analysis proposed in [9] and briefly outlined in the section 3.2, several design optimization problems can be addressed. In this paper, we address problems which are characteristic to applications distributed across multi-cluster systems consisting of heterogeneous TT and ET networks. In particular, we are interested in the following issues: 1. partitioning of the processes of an application into time-triggered and

event-triggered domains, and their mapping to the nodes of the clusters; 2. scheduling of processes and messages;

3. optimization of the access to the communication infrastructure.

The goal is to produce an implementation which meets all the timing constraints of the application.

## 3.1 Partitioning and Mapping

In this paper, by partitioning we denote the decision whether a certain process should be assigned to the TT or the ET domain (and, implicitly, to a TTC or an ETC, respectively). Mapping a process means assigning it to a particular node inside a cluster.

Very often, the partitioning decision is taken based on the experience and preferences of the designer, considering aspects like the functionality implemented by the process, the hardness of the constraints, sensitivity to jitter, legacy constraints, etc. Let  $\mathcal{P}$  be the set of processes in the application  $\Gamma$ . We denote with  $\mathcal{P}_T \subseteq \mathcal{P}$  the subset of processes which the designer has assigned to the TT cluster, while  $\mathcal{P}_F \subseteq \mathcal{P}$  contains processes which are assigned to the ET cluster.

Many processes, however, do not exhibit certain particular features or requirements which obviously lead to their implementation as TT or ET activities. The subset  $\mathcal{P}^{t} = \mathcal{P} \setminus (\mathcal{P}_{T} \cup \mathcal{P}_{E})$  of processes could be assigned to any of the TT or ET domains. Decisions concerning the partitioning of this set of activities can lead to various trade-offs concerning, for example, the schedulability properties of the system, the amount of communication exchanged through the gateway, the size of the schedule tables, etc.

For part of the partitioned processes, the designer might have already decided their mapping. For example, certain processes, due to constraints like having to be close to sensors/actuators, have to be physically located in a particular hardware unit. They represent the sets  $\mathcal{P}_T^M \subseteq \mathcal{P}_T$  and  $\mathcal{P}_E^M \subseteq \mathcal{P}_E$  of already mapped TT and ET processes, respectively. Consequently, we denote with  $\mathcal{P}_T^* = \mathcal{P}_T \setminus \mathcal{P}_T^M$  the TT processes for which the mapping has not yet been decided, and similarly, with  $\mathcal{P}_E^* = \mathcal{P}_E \setminus \mathcal{P}_E^M$  the unmapped ET processes. The set  $\mathcal{P}^* = \mathcal{P}_T^* \cup \mathcal{P}_E^* \cup \mathcal{P}^*$  then represents all the unmapped processes in the application.

The mapping of messages is decided implicitly by the mapping of processes. Thus, a message exchanged between two processes on the TTC (ETC) will be mapped on the TTP bus (CAN bus) if these processes are allocated to different nodes. If the communication takes place between two clusters, two message instances will be created, one mapped on the TTP bus and one on the CAN bus. The first message is sent from the sender node to the gateway, while the second message is sent from the gateway to the receiving node.

Let us illustrate some of the issues related to partitioning in such a context. In the example presented in Figure 2 we have an application<sup>2</sup> with six processes,  $P_1$  to  $P_6$ , and four nodes,  $N_1$  and  $N_2$  on the TTC,  $N_3$  on the ETC and the gateway node  $N_G$ . The worst-case execution times on each node are given to the right of the application graph. Note that  $N_2$  is faster than  $N_3$ , and an "X" in the table means that the process is not allowed to be mapped on that node. The mapping of  $P_1$  is fixed on  $N_1$ ,  $P_3$  and  $P_6$  are mapped on  $N_2$ ,  $P_2$  and  $P_5$  are fixed on  $N_3$ , and we have to decide how to partition  $P_4$  between the TT and ET domains. Let us also assume that process  $P_5$  is the



In this paper we consider hard real-time applications where violating a timing constraint is not acceptable.



Figure 3. Mapping Example

highest priority process on  $N_3$ . In addition,  $P_5$  and  $P_6$  have each a deadline,  $D_5$  and  $D_6$ , respectively, as illustrated in the figure by thick vertical lines.

We can observe that although  $P_3$  and  $P_4$  do not have individual deadlines, their mapping and scheduling has a strong impact on their successors,  $P_5$  and  $P_6$ , respectively, which are deadline constrained. Thus, we would like to map  $P_4$  such that not only  $P_3$  can start on time, but  $P_4$  also starts soon enough to allow  $P_6$  to meet its deadline.

As we can see from Figure 2a, this is impossible to achieve by mapping  $P_4$  on the TTC node  $N_2$ . It is interesting to observe that, if preemption would be allowed in the TT domain, as in Figure 2b, both deadlines could be met. This, however, is impossible on the TTC where preemption is not allowed. Both deadlines can be met only if  $P_4$  is mapped on the slower ETC node  $N_3$ , as depicted in Figure 2c. In this case, although  $P_4$  competes for the processor with  $P_5$ , due to the preemption of  $P_4$  by the higher priority  $P_5$ , all deadlines are satisfied.

For a multi-cluster architecture the communication infrastructure has an important impact on the design and, in particular, the mapping decisions. Let us consider the example in Figure 3. We assume that  $P_1$  is mapped on node  $N_1$  and  $P_3$  on node  $N_3$  on the TTC, and we are interested to map process  $P_2$ .  $P_2$  is allowed to be mapped on the TTC node  $N_2$  or on the ETC node  $N_4$ , and its execution times are depicted in the table to the right of the application graph.

In order to meet the deadline, one would map  $P_2$  on the node it executes fastest,  $N_2$  on the TTC, see Figure 3a. However, this will lead to a deadline miss due to the TTP slot configuration which introduces communication delays. The application will meet the deadline only if  $P_2$  is mapped on the slower node, i.e., node  $N_4$  in the case in Figure 3b<sup>1</sup>. Not only is  $N_4$  slower than  $N_2$ , but mapping  $P_2$  on  $N_4$  will place  $P_2$  on a different cluster than  $P_1$ and  $P_3$ , introducing extra communication delays through the gateway node. However, due to the actual communication configuration, the mapping alternative in Figure 3b is desirable.

#### 3.2 Multi-Cluster Scheduling

Once a partitioning and a mapping is decided, and a communication configuration is fixed, the processes and messages have to be scheduled. For the TTC this means building the schedule tables, while for the ETC the priorities of the ET processes have to be determined and their schedulability has to be analyzed. In [9] we have proposed an analysis for hard real-time applications mapped on multi-cluster systems. The aim is to find out if a system is schedulable, i.e. all the timing constraints are met.

The basic idea is that on the TTC an application is schedulable if it is possible to build a schedule table such that the timing requirements are satisfied. On the ETC, the answer whether or not a system is schedulable is given by a *schedulability analysis*. In [9], for the ETC we used a *response time analysis*, where the schedulability test consists of the comparison between the worst-case response time  $r_i$  of a process  $P_i$  and its deadline  $D_i$ . We used the concept of *offset* in order to handle data dependencies. Thus, each process  $P_i$  is characterized by an offset  $O_i$ , measured from the start of the process graph, that indicates the earliest possible start time of  $P_i$ . For example, in Figure 3,  $O_3$  is the offset of  $P_3$ , determined to guarantee that when  $P_3$  is activated, message  $m_2$  is already available.

Determining the schedulability of an application mapped on a multicluster system cannot be addressed separately for each type of cluster, since the inter-cluster communication creates a circular dependency: the static schedules determined for the TTC influence through the offsets the response times of the processes on the ETC, which on their turn influence the schedule table construction on the TTC.

The MultiClusterScheduling (MCS) algorithm proposed in [9] takes as input an application  $\Gamma$ , a mapping  $\mathcal{M}$  and a bus configuration  $\mathcal{B}$ , builds the TT schedule tables, sets the ET priorities for processes, and provides the global analysis.

#### 3.3 Bus Access Optimization

As shown in section 3.1, the communication has an important impact on the partitioning and mapping process. Hence, we are interested to determine the parameters  $\mathcal{B} = \langle \beta, \pi \rangle$  (see section 2.1) of the communication infrastructure such that the implementation is schedulable.

Figure 4 presents a bus access optimization example. An application consisting of processes  $P_1$  to  $P_4$  and messages  $m_1$  to  $m_4$  is mapped on a two-cluster architecture with node  $N_1$  on the TTC and node  $N_2$  on the ETC. Let us assume that the mapping is already determined such that processes  $P_1$  and  $P_4$  are mapped on  $N_1$  and  $P_2$  and  $P_3$  are mapped on  $N_2$ , with the execution times given in the table in Figure 4. Moreover, we assume that all messages have the same size, but the transmission times on the CAN bus are two times faster than on the TTP.

In the situation depicted in Figure 4a we have the TDMA configuration with slot  $S_1$  able to hold one message, followed by slot  $S_G$  which can hold two messages. The priority on the CAN bus is  $p_{m_2} < p_{m_3}$ . In this case,  $P_3$ 's input message  $m_2$  will be delayed by the transmission of  $m_3$ , and hence  $P_3$ 's output message  $m_4$  will miss the slot  $S_G$  in round 4, and will have to take the next round, leading to a deadline miss.

However, if we set the priority  $p_{m_2}$  greater than  $p_{m_3}$ , the transmission of the message  $m_4$  on the CAN bus will not be delayed, and will catch round 4, reducing the response time of the application, which, however, is still unschedulable.

Further improvements can be achieved by changing the order of the slots and their length in the TDMA round as indicated in Figure 4c where  $S_G$  is now the first slot, and  $S_1$  is the second slot.  $S_G$  has been shortened to hold only one message, while  $S_1$  has been enlarged to hold two messages. Let us consider that  $p_{m_2} > p_{m_1}$  on the CAN bus. With such a configuration, the implementation in Figure 4c meets the deadline.



Process T in Figure 3b executing on the gateway node N<sub>G</sub> is responsible for transferring messages between the TTP and CAN controllers.

#### MultiClusterConfiguration(Γ)

1 Step 1: $\mathcal{B}^0$  = InitialBusAccess( $\Gamma$ )  $\mathcal{M}^{0} = \text{InitialPM}(\Gamma, \mathcal{B}^{0})$ 2

- if MultiClusterScheduling( $\Gamma, \mathcal{M}^0, \mathcal{B}^0$ ) returns schedulable then stop end if 3 4 Step 2: $\mathcal{M} = \mathsf{PMHeuristic}(\Gamma, \mathcal{M}^0, \mathcal{B}^0)$
- if MultiClusterScheduling( $\Gamma$ ,  $\mathcal{M}$ ,  $\mathcal{B}^0$ ) returns schedulable then stop end if 5
- 6 Step 3: B = BusAccessOptimization(Γ, M)

MultiClusterScheduling(Γ, M, B)

end MultiClusterConfiguration

# Figure 5. The General Strategy

# **3.4 Exact Problem Formulation**

As an input we have an application  $\Gamma$  given as a set of process graphs (section 2.2) and a two-cluster system consisting of a TT and an ET cluster. As introduced previously,  $\mathcal{P}_T$  and  $\mathcal{P}_E$  are the sets of processes already partitioned into TT and ET, respectively. Also,  $\mathcal{P}_T^M \subseteq \mathcal{P}_T$  and  $\mathcal{P}_E^M \subseteq \mathcal{P}_E$  are the sets of already mapped TT and ET processes.

We are interested to:

- 1. find a partitioning for processes in  $\mathcal{P}^+ = \mathcal{P} \setminus (\mathcal{P}_T \cup \mathcal{P}_F)$  and decide a mapping for processes in  $\mathcal{P}^* = \mathcal{P}^*_T \cup \mathcal{P}^*_E \cup \mathcal{P}^+$ , where  $\overline{\mathcal{P}^*_T} = \mathcal{P}_T \setminus \mathcal{P}^M_T$ , and  $\mathcal{P}_{E}^{*} = \mathcal{P}_{E} \setminus \mathcal{P}_{E}^{M};$
- 2. determine a bus configuration  $\mathcal{B} = \langle \beta, \pi \rangle$ , where  $\beta$  is the sequence and size of the slots in a TDMA round on the TTC, and  $\pi$  is the set of message priorities on the ETC

such that imposed deadlines are guaranteed to be satisfied.

# 4. Design Optimization Strategy

The design problem formulated in the previous section is NP complete. Our strategy, outlined in Figure 5, is to divide the problem into several, more manageable, subproblems. The MultiClusterConfiguration strategy (MCC) has three steps:

In the first step (lines 1-3) we decide very quickly on an initial bus access configuration  $\mathcal{B}^0$ , and an initial partitioning and mapping  $\mathcal{M}^0$ . The initial bus access configuration (line 1) is determined, for the TTC, by assigning in order nodes to the slots  $(S_i = N_i)$  and fixing the slot length to the minimal allowed value, which is equal to the length of the largest message in the application. For the ETC we calculate the message priorities  $\pi$  based on the deadlines of the receiver processes. The initial partitioning and mapping algorithm (line 2 in Figure 5) is described in section 4.1. Once an initial partitioning and bus configuration are obtained, the application is scheduled using the MultiClusterScheduling algorithm outlined in section 3.2 (line 3).

If the application is schedulable the optimization strategy stops. Otherwise, it continues with the second step by using an iterative improvement PMHeuristic (line 4), presented in section 4.2, to improve the partitioning and mapping obtained in the first step.

If the application is still not schedulable, we use, in the third step, the algorithm in section 4.3 to optimize the access to the communication infrastructure (line 6). If the application is still unschedulable, we conclude that no satisfactory implementation could be found with the available amount of resources.

# 4.1 Initial Partitioning and Mapping (IPM)

Our IPM algorithm (Figure 6) receives as input the merged graph G and the bus configuration  $\mathcal{B}$ . G is obtained by merging all the graphs of the application, and has a period equal to the LCM of all constituent graphs [10].

The IPM algorithm uses a list scheduling based greedy approach. A process  $P_i$  is placed in the ready list  $\mathcal{L}$  if all its predecessors have been already scheduled. In each iteration of the loop (lines 2-7), all ready processes from the list  $\mathcal{L}$  are investigated, and that process  $P_i$  is selected for mapping by the SelectProcess function, which has the largest delay  $\delta_i = r_i + l_i$ . In the previous equation,  $r_i$  is the response time of process  $P_i$  on the fastest node in  $\mathcal{N}_{P_i}$ , and  $l_i$  is the critical path starting from process  $P_i$ , defined as:

InitialPM(G, B) -- Initial Partitioning and Mapping

 $\mathcal{L} = \{$ source of  $\mathcal{G}\}$  -- start initial mapping with the first node of the merged graph while  $\mathcal{L} \neq \emptyset$  do -- visits ready processes in the order of list scheduling

- P = SelectProcess(L)
- $N = SelectNode(\mathcal{N}_P)$
- M(P) = N -- map process P on node N
- $\mathcal{L} = UpdateReadyList(\mathcal{L})$

7 end while end InitialPM

Figure 6. The Initial Partitioning and Mapping

$$l_i = \max_{k} \sum_{\forall \tau_i \in \pi_{ik}} r_{\tau_i}$$
(1)

where  $\pi_{ik}$  is the  $k^{th}$  path from process  $P_i$  to the sink node of  $\mathcal{G}$  (not including  $P_i$ ), and  $r_{\tau_i}$  is the response time of a process or message on  $\pi_{ik}$ . The response times are calculated using the MultiClusterScheduling function, under the following assumptions:

- Every yet unpartitioned/unmapped process  $P_i \in \mathcal{P}^*$  is considered mapped on the fastest node from the list of potential nodes  $\mathcal{N}_{P,.}$
- The worst-case response time for messages sent or received by yet unpartitioned/unmapped processes is considered equal to zero.

Let us consider the design example in Figure 7 where we have five processes,  $P_1$  to  $P_5$ , and three nodes,  $N_1$  on the TTC,  $N_2$  on the ETC and the gateway node  $N_{G}$ . The initial bus configuration, consisting of the slots order and size, together with the ET message priorities, is also given. The mapping of  $P_3$  is fixed on  $N_1$ ,  $P_5$  is fixed on  $N_2$ , and we have to decide where to partition and map  $P_1, P_2$  and  $P_4$ . In the first iteration of IPM, SelectProcess has to decide between  $P_1$  and  $P_2$  which are ready for execution. The critical path of  $P_1$  is  $l_1 = \max(r_{m_1})$  $+r_3 + r_{m_4} + r_5, r_{m_2} + r_4 + r_{m_5} + r_5) = \max(0 + 40 + 40 + 40, 0 + 30 + 0 + 40) =$ 120, while  $l_2 = r_{m_3} + r_4 + r_{m_5} + r_5 = 0 + 30 + 0 + 40 = 70$ . Thus, the delay of  $P_1$  is  $\delta_1 = C_1^{N_2} + l_1 = 30 + 120 = 150$ , and the delay of  $P_2$  is  $\delta_2 = C_2^{N_2} + l_2 = 60 + 70$ =  $130^{1}$ . Therefore, SelectProcess will select  $P_{1}$  because it has a larger delay.

Once a process  $P_i$  is selected, all mapping alternatives of  $P_i$  to nodes<sup>2</sup> in  $\mathcal{N}_{P_{i}}$  are tested by the SelectNode function. Out of these alternatives, SelectNode returns that node  $N_k$  which leads to the smallest end-to-end delay  $\delta_i^{N_k}$  on the application graph:

$$\delta_i^{N_k} = O_i^{N_k} + r_i^{N_k} + l_i^{N_k}.$$
 (2)

In the previous equation,  $O_i^{N_k}$  is the offset of process  $P_i$  when mapped on node  $N_k$  (i.e., the earliest possible starting time taking into account the predecessors and the communication delay of the incoming messages) calculated by our scheduling algorithm.

The worst-case response time  $r_i^{N_k}$  is equal to the worst-case execution time  $C_i^{N_k}$  if  $N_k$  is in the TTC ( $N_k \in \mathcal{N}_T$ ). If  $N_k$  is in the ETC ( $N_k \in \mathcal{N}_E$ ), the worstcase response time is calculated according to the equations below:

$$r_i^{N_k} = J_i + w_i + C_i^{N_k}$$

$$(3)$$

$$v_i = B_i + \sum_{\forall P_j \in hp(P_i)} \left| \frac{w_i + J_j - O_{ij}^{**}}{T_j} \right|_0 C_j^{N_k}$$
(4)

where  $J_i$  is the worst-case jitter of process  $P_i$ , and  $w_i$  represents the worstcase interference on  $P_i$  caused by lower priority processes in their critical section (the term  $B_i$  in Equation 4) and by higher priority processes  $P_i \in hp(P_i)$  running on the same node  $N_k$  with  $P_i$  (the second term<sup>3</sup> in Equation 4).  $T_i$  represents the period of process  $P_i$  and  $O_{ii}$  is a positive value representing the relative offset of processes  $P_i$  and  $P_i$ .

v



Figure 7. Design Example

1. According to the first assumption, both  $P_1$  and  $P_2$  are considered mapped on the fastest node.  $\mathcal{N}_{P_i}$  is the set of nodes on which process  $P_i$  could, potentially, be executed. If the process is 2. already partitioned to a certain cluster, only nodes in that cluster are considered.

3.  $[x]_0$  is the positive ceiling, returning the smallest integer greater than x, 0 if x is negative.

The third term of the delay  $\delta_i^{N_k}$  represents the critical path from process  $P_i$  to the sink node (as introduced in Equation 1) in the case  $P_i$  is mapped on node  $N_k$ . The delay  $\delta_i^{N_k}$  is calculated by the MultiClusterScheduling function, under the same assumptions mentioned earlier.

Let us go back to the example in Figure 7. IPM has decided in the first two iterations of the while loop (lines 2–7 in Figure 6) that  $P_1$  should be mapped on  $N_1$  and  $P_2$  on  $N_2$ . In the third iteration,  $P_4$  has been selected by Select-Process, and now the mapping alternatives on  $N_1$  and  $N_2$  are tested by the SelectNode function. According to Equation 2, if  $P_4$  is mapped on  $N_1$  we have  $\delta_4^{N_1} = O_4^{N_1} + r_4^{N_1} + l_4^{N_1} = 120 + 40 + (40 + 40) = 240$  (see Figure 7a). Similarly, for the alternative on  $N_2$  we have  $\delta_4^{N_2} = O_4^{N_2} + r_4^{N_2} + l_4^{N_2} = 80 + 30 + (0 + 40) = 150$  (see Figure 7b). Thus,  $P_4$  will be mapped on  $N_2$  which produces the smallest delay of 150. IPM will finally produce the schedulable solution presented in Figure 7b.

## 4.2 Partitioning and Mapping Heuristic (PMH)

If, after the initial partitioning, mapping and bus setup we do not obtain a schedulable application, we apply an iterative improvement algorithm, the PMHeuristic in Figure 8. The algorithm receives as input the application  $\Gamma$ , the initial partitioning and mapping  $\mathcal{M}^0$  produced by IPM, and the bus configuration  $\mathcal{B}^0$ , and produces a partitioning and mapping for processes in  $\mathcal{P}^*$ .

We investigate each unschedulable graph  $G_i \in \Gamma$ , i.e., the response time  $r_{G_i}$  is larger than the deadline  $D_{G_i}$ . Our heuristic is to perform changes to the mapping of processes in  $\Gamma$  that would reduce the critical path of  $G_i$ , and thus the worst-case response time  $r_{G_i}$ .

In each iteration, the algorithm selects that unschedulable process graph  $G_i$  which has the maximum delay  $\Delta_{G_i} = r_{G_i} - D_{G_i}$  between its response time and the deadline (line 2). Let us denote the maximum delay with  $\Delta_{max}$ , and the corresponding graph with  $G_{max}$ . Next, we determine the critical path  $\mathcal{P}_{CP}$  of the process graph  $G_{max}$ . For example, for the process graph in Figure 7 scheduled as in case (a), the critical path is composed of  $P_2$ ,  $P_4$  and  $P_5$ .

The intelligence of the heuristic lies in how it determines changes (i.e., design transformations) to the mapping of processes that potentially can lead to a shortening of the critical path (lines 7 and 9). The list of proposed changes *List* leading to a potential improvement are then evaluated (lines 11–18) to find out the change that produces the largest reduction of  $\Delta_{max}$ , which is finally applied to the system configuration (line 20). Reducing  $\Delta_{max}$  investigated in the current iteration. The algorithm terminates if all graphs in the application are schedulable, or no improvement to  $\Delta_{max}$  is found.

Since a call to MultiClusterScheduling that evaluates the changes is costly in terms of execution time, it is crucially to find out a short list of proposed changes that will potentially lead to the largest improvement. Looking at Equation 2, we can observe that the length of the critical path  $\mathcal{P}_{CP}$  would be reduced if, for a process  $P_i \in \mathcal{P}_{CP}$ , we would:

```
PMHeuristic(Γ, M, B) -- Partitioning and Mapping Heuristic
   while (\exists G_i \in \Gamma \land r_{G_i} > D_{G_i}) and (\Delta_{max} \text{ improved in the previous iteration}) do \Delta_{max} = maximum \text{ of } r_{G_i} - D_{G_i}, \forall G_i \in \Gamma \land r_{G_i} > D_{G_i}
1
2
3
          G_{max} = graph corresponding to \Delta_{max}
          \mathcal{P}_{CP} = FindCriticalPath(G_{max})
4
          for each P_i \in \mathscr{P}_{CP} do -- find changes with a potential to improve r_{G_{max}}
5
             if M(P_i) \in \mathcal{N}_T then
6
                 List = ProposedTTChanges(Pi)
7
              else -- in this case M(P_i) \in \mathcal{N}_E
8
                 List = ProposedETChanges(Pi)
9
              end if
10
              for each ProposedChange \in List do -- determine the improvement
11
                 Perform(ProposedChange); MultiClusterScheduling(\Gamma, \mathcal{M}, \mathcal{B})
12
13
                   A_{max} = maximum \text{ of } r_{G_i} - D_{G_i}, \forall G_i \in \Gamma \land r_{G_i} > D_{G_i}
                 if \Delta_{max} smallest so far then
14
                     BestChange = ProposedChange
15
16
                  end if
                 Undo(ProposedChange)
17
18
             end for
               - apply the move improving the most
19
20
             If 3 BestChange then Perform(BestChange) end if
          end for
21
22end while
23return M
end PMHeuristic
```

```
Figure 8. The Partitioning and Mapping Heuristic
```

- 1. reduce the offset  $O_i$  (first term of Equation 2);
- 2. decrease the worst-case response time  $r_i$  (second term);
- 3. reduce the critical path from  $P_i$  to the sink node (third term).

To reduce (1) we have to reduce the delay of the communication from  $P_i$ 's predecessors to  $P_i$ . Thus, we consider transformations that would change the mapping of process  $P_i$  and of predecessors of  $P_i$  such that the communication delay is minimized. However, only those predecessors are considered for remapping which actually delay the execution of  $P_i$ . Let us go back to Figure 7, and consider that PMH starts from an initial partitioning and mapping as depicted in Figure 7a. In this case, to reduce the offset  $O_4$  of process  $P_4$ , we will consider mapping  $P_4$  on node  $N_2$  as depicted in Figure 7b, reducing thus the offset from 120 to 80.

The approach to reduce (2) depends on the type of process. Both for TT and ET processes we can decrease the worst-case execution time  $C_i$  by selecting a faster node. For example, in Figure 7, by moving  $P_4$  from  $N_2$  to  $N_1$  we reduce its worst-case execution time from 40 to 30. However, for ET processes we can further reduce  $r_i$  by investigating the interference from other processes on  $P_i$  (Equation 4). Thus, we consider mapping processes with a priority higher than  $P_i$  on other nodes, reducing thus the interference.

Point (3) is concerned with the critical path from process  $P_i$  to the sink node. In this case, we are interested to reduce the delay of the communication from  $P_i$  to its successor process on the critical path. This is achieved by considering changes to the mapping of  $P_i$  or to the mapping of the successor process (e.g., by including them in the same cluster, same processor, etc.). For example, in Figure 7a, the critical path of  $P_4$  is enlarged by the communication delay due to  $m_5$  exchanged by  $P_4$  on the TTC with  $P_5$  on the ETC. To reduce the length of the critical path we will consider mapping  $P_4$  to  $N_2$ , and thus the communication will take place on the same processor.

#### **4.3 Bus Access Optimization (BAO)**

The BusAccessOptimization function (line 6 in Figure 5) determines the configuration  $\mathcal{B}$  consisting of the sequence and size of the slots in a TDMA round on the TTC ( $\beta$ ) and the priorities of messages on the ETC ( $\pi$ ). This optimization is performed as a last attempt to obtain a schedulable configuration. The optimization of the  $\beta$  and  $\pi$  parameters starts from the initial values set by the InitialBusAccess function.

The algorithm performs a greedy optimization whereby the ET priorities  $\pi$  are determined using the HOPA heuristic [5], where priorities in a distributed real-time system are determined based on the local deadlines, which are calculated for each activity considering the end-to-end (global) deadlines. Next, the TTP configuration  $\beta$  is determined. Thus, simultaneously with searching for the right node  $N_i \in \mathcal{N}_T \cup \{N_G\}$  to be assigned to the first slot, the algorithm looks for the optimal slot length. Once a node was selected for the first slot and a slot length fixed, the algorithm continues with the next slots, trying to assign nodes (and to fix slot lengths) from those nodes which have not yet been assigned. When calculating the length of a certain slot we consider the feedback from the MultiClusterScheduling algorithm which recommends slot sizes to be tried out. Before starting the actual optimization process for the bus access scheme, a scheduling of the initial solution is performed which generates the recommended slot lengths. We refer the reader to [3] for details concerning the generation of the recommended slot lengths for the time-triggered protocol.

# **5. Experimental Results**

For the evaluation of our algorithms we used applications of 50, 100, 150, 200, and 250 processes (all unpartitioned and unmapped), to be implemented on two-cluster architectures consisting of 2, 4, 6, 8, and 10 different nodes, respectively, half on the TTC and the other half on the ETC, interconnected by a gateway.

Thirty examples were randomly generated for each application dimension, thus a total of 150 applications were used for experimental evaluation. We generated both graphs with random structure and graphs based on more regular structures like trees and groups of chains. Execution times and message lengths were assigned randomly using both uniform and exponential distribution within the 10 to 100 ms, and 2 to 8 bytes ranges, respectively. The experiments were done on SUN Ultra 10 computers.





We were interested to evaluate the proposed approaches. Hence, we have implemented each application, on its corresponding architecture, using the MultiClusterConfiguration (MCC) strategy from Figure 5. Figure 9a presents the number of schedulable solutions found after each step of our optimization strategy (N/S stands for "not schedulable"). Together with the MCC steps, Figure 9a also presents a straightforward solution (SF). The SF approach performs a partitioning and mapping that tries to balance the utilization among nodes and buses. This is a configuration which, in principle, could be elaborated by a careful designer without the aid of optimization tools like the one proposed in the paper.

Out of the total number of applications, only 19% were schedulable with the implementation produced by SF. However, using our MCC strategy, we are able to obtain schedulable applications in 85% of the cases: 30% after step one (IPM), 76% after step two (PMH), and 85% after step three (BAO). It is easy to observe that, for all application dimensions, by performing the proposed optimization steps, large improvements over the straightforward configuration could be produced. Moreover, as the applications become larger, it is more difficult for SF to find schedulable solutions, while the optimization steps of MCC perform very well. For 150 processes, for example, MCC has been able to find schedulable implementations for 83% of the applications. The bottom bar, corresponding for 26%, is the percentage of schedulable applications found by IPM. On top of that, PMH, depicted by a black bar, adds another 47%. The top bar from the stack, represented using a hashed rectangle, represent the additional 10% of schedulable implementations found after performing the bus access optimization (BOA).

Figure 9b presents the execution times for each of the three steps of our multi-cluster configuration strategy, as well as for the complete algorithm (MCC). Note that the times presented in the figure for MCC include a complete optimization loop, that performs partitioning, mapping, bus access optimization and scheduling. The complete optimization process implemented by the MCC strategy takes under five hours for very large process graphs of 250 processes, while for applications consisting of 100 processes it takes on average 2.28 minutes.

Finally, we considered a real-life example implementing a vehicle cruise controller (CC). The process graph that models the CC has 32 processes, and is described in [10]. The CC was mapped on an architecture consisting of five nodes: Engine Control Module (ECM) and Electronic Throttle Module (ETM) on the TTC, Anti Blocking System (ABS) and Transmission Control Module (TCM) on the ETC, and the Central Electronic Module (CEM) as the gateway. We have considered a deadline of 150 ms.

In this setting, the SF approach failed to produce a schedulable implementation, leading to response time of 392 ms. After IPM (first step of MCC), we were able to reduce the response time of the CC to 154, which is still larger than the deadline. However, applying PMH (step two) we are able to obtain a schedulable implementation with a response time of 146 ms. Applying the BAO step is able to reduce it further to 144 ms. All these three steps taken together execute for under two minutes for the CC.

## **6.** Conclusions

In this paper we have presented design optimization strategies for realtime applications distributed over multi-cluster systems. We have considered systems of time-triggered and event-triggered clusters, interconnected via gateways.

The proposed approaches solve the problems characteristic to such multi-cluster systems: partitioning, mapping the functionality of the application on the heterogeneous nodes of a cluster and adjusting the parameters of the communication protocols such that the timing constraints of the application are guaranteed.

Extensive experiments using synthetic applications, as well as a reallife example, show that by using our optimization approaches we are able to find schedulable implementations under limited resources, achieving an efficient utilization of the system.

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