

#### Migrating Constant Bandwidth Servers on Multi-Cores





A Model-driven development framework for highly Parallel and EneRgy-Efficient computation supporting multi-criteria optimisation



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# Background and motivations #1/2



#### **Relentless growth of computing demand**

- satisfied for years by the "frequency-race"
- up to the impossibility of handling **heat** dissipation
  - Intel's cancelled plans for 5GHz-10GHz CPUs in 2004
- => we've been living a "**multi-core race**" in the last decade

#### Multi-core/multi-processing pervasive

- not only in High-Performance Computing (HPC)
- but also in embedded and real-time systems
- noteworthy modern use-cases: high-performance embedded scenarios
  - intelligent real-time driving assistants
  - real-time video processing and object recognition
  - real-time time-series forecasting
- Need for a multitude of "acceleration" technologies:
  - Multi-core, GP-GPU, FPGA





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# Background and motivations #2/2



- Open real-time systems
  - dynamic real-time task sets on multi-core platforms
    - new RT tasks may ask to be admitted at any time
    - running RT tasks may terminate and leave the system
  - requirement of minimizing energy consumption (mobile devices)
- Frequent migration of RT tasks among cores
  - when using utilization-based heuristics for task/core assignment
  - First-Fit
    - **good**: simple utilization-based overall test (based on biggest *U<sub>i</sub>*)
    - **bad:** for energy-management
    - on DVFS frequencies scale up/down => need to migrate tasks to restore FF invariant
  - Worst-Fit
    - good: load spread across cores
      - allows for keeping lower DVFS frequencies
    - **bad**: if a new big *U* arrives => **need to migrate** tasks to make room

## **Problem Presentation #1/2**



#### Focus of the paper

- Adaptive Partitioning of RT tasks on multi-cores
  - focus on independent, periodic tasks
- RT tasks scheduled using CBS/EDF reservations (i.e., SCHED\_DEADLINE)
  - each task with parameters (WCET C<sub>i</sub>, T<sub>i</sub>)
     has associated a reservation with (Q<sub>i</sub>, P<sub>i</sub>)
    - normally  $Q_i = C_i$  and  $P_i = T_i$
  - at any time tasks (and their reservations) are partitioned among cores
    - reservations  $\{(Q_i, P_i)\}_i$  deployed onto each core respect

$$\sum_{i} \frac{Q_i}{P_i} \le U^{lub} \tag{1}$$

• CBS handles a current budget  $q_i(t)$  and abs deadline  $d_i(t)$ 

## **Problem Presentation #2/2**



(2)

- RT tasks arrive dynamically at run-time
- each RT task is accepted on a specific core
  - so that Eq. (1) is satisfied incremental test
    - total utilization of core h at time t:  $V_h(t) = \sum_{i=1}^{n} U_{i}$ .
- RT reservations may need to be migrated across cores
- Focus of the paper:
  - on-line tracking of  $V_h(t)$
  - and its use for admitting new tasks/reservations

## Migrating CBS servers #1/2

- When a CBS with U<sub>i</sub> = Q<sub>i</sub>/P<sub>i</sub> leaves a CPU h (migration or termination)
  - we cannot immediately subtract  $U_i$  from  $V_h(t)$
  - otherwise the incremental test based on V<sub>h</sub>(t) might mistakenly admit new tasks that would lead to deadline misses
  - we can safely do it
    - on the **current deadline**  $d_i(t)$
    - earlier, at the **0-lag time**  $\delta_i = d_i (t) q_i (t)/U_i$
  - a scheduler should track the 0-lag times



Figure 1: Example of deadline miss when the utilization of a task *t*1 that is removed from the CPU runqueue, is forgotten immediately and a new task *t*3 is mistakenly admitted too early.

 SCHED\_DEADLINE in Linux has the *inactive timer* that can be used for this purpose

## Migrating CBS servers #2/2

- When a CBS with  $U_i = Q_i/P_i$  leaves a CPU h
  - decreasing immediately U<sub>i</sub> from V<sub>h</sub>(t)
     risk of deadline misses (incorrect)
  - post-poning U<sub>i</sub> subtraction to d<sub>i</sub>(t) or 0-lag times
     safe, but pessimistic
- In this paper, we demonstrate we can do better
  - keep simplicity of utilization-based admission tests
  - refine how exactly a task is admitted, considering the (still active) utilization of tasks that recently left the CPU

1 1

## **Proposed Admission Test**

• Consider at each time *t* the sum of all (still active) utilizations of migrated reservations in the future

(5)

$$V_{i,h}^{m}(t) = \begin{cases} U_{i} \text{ if } \tau_{i} \notin \Gamma_{h}(t) \land t < \delta_{i} \\ 0 \text{ otherwise } (\text{ if } \tau_{i} \in \Gamma_{h}(t) \lor t \ge \delta_{i}). \end{cases}$$
(4)

$$V_{h}^{m}\left(t\right) = \sum_{\tau_{i} \in \Gamma_{h}^{m}\left(t\right)} V_{i,h}^{m}\left(t\right).$$

- $V_h(t) + V_h^m(t)$  is a step function
- New task with  $U_i = Q_i/P_i$  admitted when:
  - known utilization test:

$$V_{h}(t) + V_{h}^{m}(t) + U_{i} \leq U^{lub} \iff U_{i} \leq U^{lub} - (V_{h}(t) + V_{h}^{m}(t)) \quad (6)$$
  
$$Q_{i} \leq P_{i} \left( U^{lub} - V_{h}(t) - V_{h}^{m}(t) \right). \quad (7)$$

proposed budget test:

$$Q_i \le P_i \left( U^{lub} - V_h(t) \right) - \int_{s=t}^{t+P_i} V_h^m(s) ds, \tag{8}$$



Q<sub>max</sub>

Figure 3: Highlight of the gain in the admitted budget for the proposed technique relying on Equation (8) (highlighted area in the bottom plot), compared to the one admitted using Equation (7) (highlighted area in the top plot).

### Proof

- $\sigma(t')$ : schedule when  $\tau_i$  released at t
- $\sigma'(t')$ : schedule when  $\tau_i$  released at t' < t
- scheduler: EDF
- $d_i(t)$  unchanged => same prio in  $\sigma$  and  $\sigma'$ =>  $\tau_i$  cannot miss
- can other tasks miss due to the early release of *τ<sub>i</sub>*?
- t<sub>0</sub>: time after which all jobs active in [t',t] and with deadline earlier than d<sub>i</sub>(t) completed
- if  $t_0 >= t$ , then  $\sigma = \sigma'$
- If t<sub>0</sub> < t, a task τ<sub>j</sub> with d<sub>j</sub>(t) > d<sub>i</sub>(t) might be delayed in [t<sub>0</sub>, t]
  => a deadline miss can only happen for a task j with deadline d<sub>j</sub>(t) > d<sub>i</sub>(t)
- $\tau_i$  has  $Q_i$  time units in [t,  $d_i(t)$ ] in  $\sigma$
- if τ<sub>i</sub> preempts τ<sub>j</sub> for an interval q<sub>0</sub> in [t<sub>0</sub>, t]
  => q<sub>0</sub> of his time units in [t, d<sub>i</sub>(t)] are usable by τ<sub>j</sub> to recover the delay
  => no deadline miss possible in σ'

LEMMA 6.1. If a taskset  $\Gamma = \{\tau_1, ... \tau_n\}$  is schedulable on a core h when task  $\tau_i \in \Gamma$  is activated at time t with deadline  $d_i(t)$  and budget q(t), the activation time can be moved to t' < t (leaving  $d_i(t)$  unchanged) without breaking the taskset's schedulability.



Figure 4: Visualization useful for a better understanding of the proof of Lemma 6.1.







- At time *t*, we need to admit a new reservation  $(Q_{n+1}, P_{n+1})$
- For each migrated utilization  $U_i$  scheduled to be subtracted by  $V_h^m(t)$  at some time  $\delta_i$
- A new task of utilization  $U_i$  can safely enter the CPU at time  $\delta_i$
- All these new tasks may be given the same absolute deadline:  $t + P_{n+1}$
- Their release time can be safely moved back to time *t* (for Lemma 6.1)
- They are equivalent to a single task with the maximum budget of Theorem 1

**Theorem 1.** A new task  $\tau_{n+1}$  served by a CBS  $(Q_{n+1}, P_{n+1})$  can be admitted on core h at time t if the following condition is respected:

$$Q_{n+1} \leq \left( U^{lub} - V_h(t) - \sum_{\tau_j \in \Gamma_h^m(t)} U_j \right) P_{n+1} + \sum_{\substack{\tau_j \in \Gamma_h^m(t):\\\delta_j \leq t+P_i}} U_j \left( t + P_{n+1} - \delta_i \right).$$

### Experimental Validation by Simulation



- EDF scheduler in RTSim
- Random task sets (Emberson's taskgen.py)
  - overall utilization  $U_{tot}$  of 0.90, 0.95 and 0.99
  - number of tasks *n* from 4 to 10
  - periods with log-uniform distribution in [1000, 2000], and period granularity of 100 time units
- Scenario (1000 repetitions for each value of U, n, k)
  - task sets started synchronously
  - **simulation paused at random times**, until we find a time in which there are <u>at least k</u> <u>tasks with 0-lag time in the future</u> (k = 1, 2, 3)
  - *k* of said tasks are **killed**
  - new task added to the CPU with
    - random period within the minimum and twice the maximum among the times to the deadlines of the k killed tasks
    - runtime  $Q^{new}$  equal to the maximum allowed by Theorem 1
  - simulation continued till 10 times the biggest period in the tasks set
  - verified that no deadline misses occurred
  - log maximum runtime  $Q^{old}$  according to old utilization-based test of Eq.(7) and the **bandwidth gain** defined as  $(Q^{new} Q^{old}) / Q^{old}$

#### Experimental Validation by Simulation

Table 1: Obtained maximum relative response times and average bandwidth gain for the simulated scenarios.

		maximum	average
Utot	k	resptime/T	bw gain
0.90	1	0.9000	2.03741
0.90	2	0.8973	2.99117
0.90	3	0.8973	4.21386
0.95	1	0.9500	3.23395
0.95	2	0.9467	5.18756
0.95	3	0.9467	7.77282
0.99	1	0.9900	12.8519
0.99	2	0.9867	22.8740
0.99	3	0.9867	35.3014



Figure 6: Experimental CDF of the response times relative to the periods in various configurations.

## Conclusions



#### **Proposed novel utilization test for admitting CBS reservations to a CPU**

- less pessimistic than existing utilization-based test
- ease of use similar to a utilization-based test

# Useful in scenarios with frequent migrations of RT tasks (and their reservations) among CPUs

- for example, with adaptive partitioning
- on mobile platforms, when applying DVFS changes to CPU frequency

#### **Correctness of the new test**

- Formally demonstrated
- Verified by simulations

## Future Work

- 5-10-15-
- Integrate within Adaptive Partitioning variant of SCHED\_DEADLINE we have at RETIS
- Integrate with power-aware variant of SCHED\_DEADLINE being investigated for big.LITTLE and DynamIQ Arm architectures
- Evaluate applicability in the context of the usecases of the **AMPERE** EU project (2020-2022) https://ampere-euproject.eu/
  - Automotive
  - Tramway



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## **Our related publications**



#### Journals

- A. Mascitti, T. Cucinotta, M. Marinoni, L. Abeni. "Dynamic Partitioned Scheduling of Real-Time Tasks on ARM big.LITTLE Architectures," <u>Elsevier Journal of Systems and Software (JSS)</u>, Vol. 173, March 2021
- D. B. De Oliveira, R. S. De Oliveira, T. Cucinotta. **"A thread synchronization model for the PREEMPT\_RT Linux kernel,"** <u>Elsevier Journal of Systems Architecture (JSA)</u>, Vol. 107, August 2020
- L. Abeni, T. Cucinotta. "EDF scheduling of real-time tasks on multiple cores: adaptive partitioning vs. global scheduling," ACM SIGAPP Applied Computing Review, Vol. 20, Issue 2 (June 2020), pp. 5-18, July 2020
- A. Balsini, T. Cucinotta, L. Abeni, J. Fernandes, P. Burk, P. Bellasi, M. Rasmussen. "Energy-Efficient Low-latency Audio on Android," <u>Elsevier Journal of Systems and Software (JSS)</u>, Vol. 152, pp. 182-195, June 2019
- Improving Responsiveness of Time-Sensitive Applications by Exploiting Dynamic Task Dependencies, <u>Software:</u> <u>Practice and Experience</u>, April'18

#### Conferences

- A. Mascitti, T. Cucinotta. "Dynamic Partitioned Scheduling of Real-Time DAG Tasks on ARM big.LITTLE Architectures," 29th International Conference on Real-Time Networks and Systems (RTNS 2021), April 7-9, 2021, Nantes, France.
- D. B. de Oliveira, D. Casini, R. S. de Oliveira, T. Cucinotta. "Demystifying the Real-Time Linux Scheduling Latency," 32nd Euromicro Conference on Real-Time Systems (ECRTS 2020), July 7-10, 2020, Modena, Italy.
- E. Quiñones, S. Royuela, C. Scordino, L. M. Pinho, T. Cucinotta, B. Forsberg, A. Hamann, D. Ziegenbein, P. Gai, A. Biondi, L. Benini, J. Rollo, H. Saoud, R. Soulat, G. Mando, L. Rucher, L. Nogueira. "The AMPERE Project: A Model-driven development framework for highly Parallel and EneRgy-Efficient computation supporting multi-criteria optimization," 23rd IEEE International Symposium on Real-Time Distributed Computing (IEEE ISORC 2020), May 19-21, 2020, Nashville, Tennessee, USA.
- A. Mascitti, T. Cucinotta, L. Abeni. "Heuristic partitioning of real-time tasks on multi-processors," <u>23rd IEEE International</u> <u>Symposium on Real-Time Distributed Computing (IEEE ISORC 2020)</u>, May 19-21, 2020, Nashville, Tennessee, USA.
- G. Serra, G. Ara, P. Fara, T. Cucinotta. "An Architecture for Declarative Real-Time Scheduling on Linux," <u>23rd IEEE</u> <u>International Symposium on Real-Time Distributed Computing (IEEE ISORC 2020)</u>, May 19-21, 2020, Nashville, Tennessee, USA.







#### **Questions ?**



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