



IDEA 2015

Investigating
Dataflow in
Embedded computing
Architecture

Pipelined Scheduling of Acyclic SDF Graphs using SMT Solvers

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Motivation

- **from hardware to software**, due to embedded multi-cores
Kalray MPPA256, Tiler GX, ST Micro P2012/Shtorm
- **SDF** – important programming model [Lee, Messerschmitt 1987]

SDF compilers :

SDF3, DOL, StreamIT, SigmaC, ...

compiler optimizations may require **generic problem-solvers** :

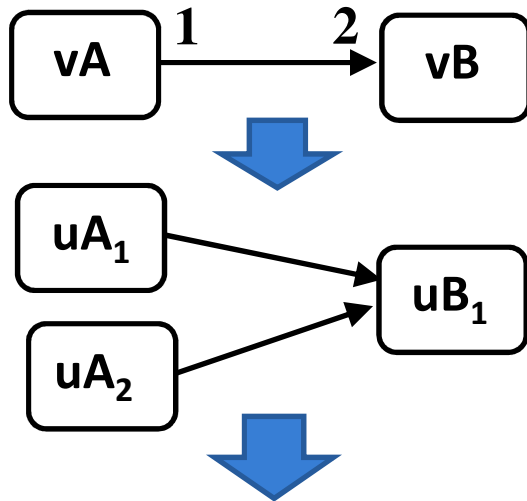
model-checking (UPPAAL,...), ILP (Ipsolve,...), SMT (Z3, ...), etc...

- **multi-criteria optimization**, whereby constraints and costs may undergo frequent modification
- **real-time constraints** apply, schedulability analyses require support of preemption, missing in DSP/many-cores

Real-time Constraints

- Real-time systems: tasks $\mathcal{T}_i : (C_i, D_i, T_i)$
 - C_i - WCET
 - D_i - deadline **PIPELINING : $T < D$**
 - T_i - period
- DAG tasks
 - \mathcal{T}_i is a DAG
 - sub-tasks U and precedence arcs $\mathcal{E} : (U_i, \mathcal{E}_i, C_i(u \in U), D_i, T_i)$
 - for simplicity: **one DAG task \mathcal{T}**
 - call it **task graph**
 - it is SDF translated to HSDF
 - **pipelining for task graph**

SDF – synchronous dataflow



```
Thread T -- in general, must be multi-thread
A__B : new FIFO;
procedure A is SubroutineA (A__B); -- actor vA
procedure B is SubroutineB (A__B); -- actor vB
k : Integer;
begin
    for k in 1 .. ∞ loop
        A(1); A(2); B(1); -- uA1 uA2 uB1
    end loop
end
```

SDF graph $\mathcal{S} (V, E)$

vA, vB – **actors**
atomic software subroutines

derived HSDF

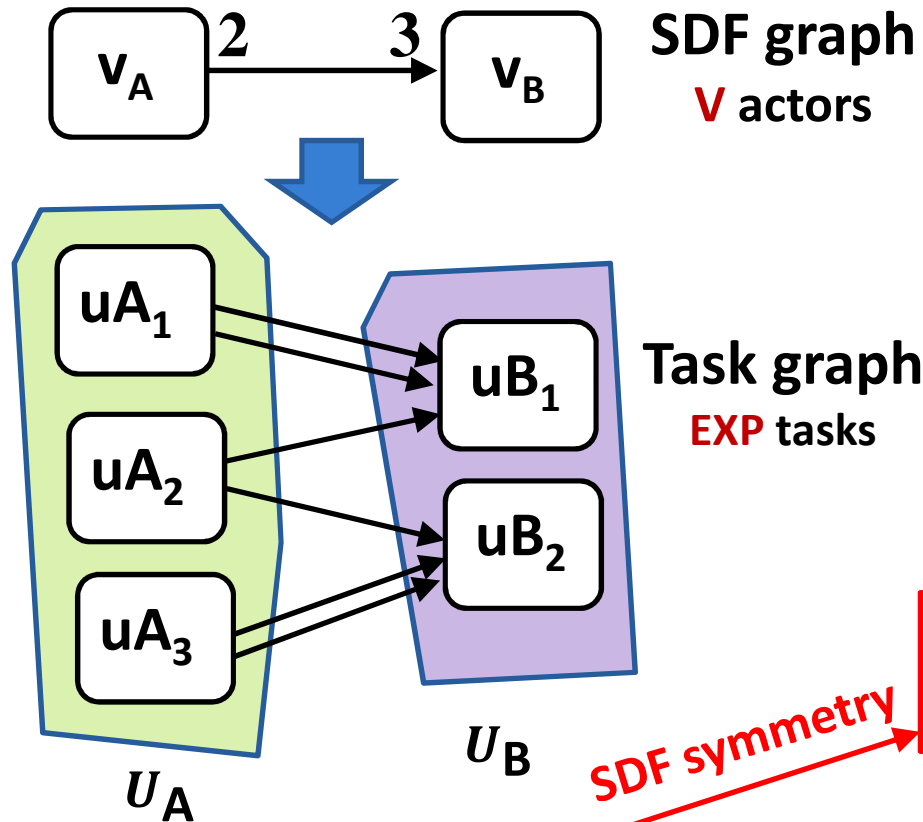
task graph: $\mathcal{T} (U, \mathcal{E})$

U – uA_1, uA_2, uB_1 – **tasks**

instances (copies) of actor subroutines

\mathcal{E} – precedence arcs;

SDF – synchronous dataflow



$$U = U_A \cup U_B; \quad U_A = \{uA_1, uA_2, uA_3\}$$

task-to-SDF connection

SDF symmetry

SDF schedule schemes:
from general to restrictive
 $s(u, k)$ - “schedule” variable
 start time of k -th execution of task u

1. Self-timed (no restrictions)

2. Frame-periodic tasks

$$s(u, k + W) = s(u, k) + WT$$

W free variables per task $O(EXP)$

3. Periodic tasks: (DAG tasks)

$$W = 1$$

$O(EXP)$

4. Periodic actors: (common for SDF)

uA_m have period T/U_A

uB_n have period T/U_B

one free variable per actor $O(V)$

Multi-core Architecture

- homogeneous multiprocessor
- consists of **clusters** (islands, tiles)
 - **cluster** = M cores + shared memory
- between clusters – network on chip communication
future work
- e.g. Shtorm (ST Micro), MPPA 256 (Kalray)
 - 16 clusters x 16 cores, $M=16$
- this work – assume one cluster with M processors
- inside cluster – **instantaneous communication**

Problem Encoding for an SMT Solver (1)

- **atom:** **difference logic** $A : x \leq C$ or $B : x - y \leq C$

- **constraint:** **Boolean** $(A \vee B) \wedge \neg C$

- **constraint logic programming**

find variable assignment satisfying all the constraints

SMT = **satisfiability modulo theory** tools, **Yices**, **Z3**, **MathSAT**, ...

satisfiability – for **Boolean** constraints

theory – for **difference logic | linear arithmetic | ...** atoms

Problem Encoding for an SMT Solver (2)

- Variables: $s(u)$ and $\mu(u)$ for $u \in U$

$s(u) \in [0, +\infty)$: the first scheduled time :

$$s(u) = s(u, k) |_{k=0}$$

$$s(u, k) = s(u) + kT$$

$\mu(u) \in \{1, 2, \dots\}$: the processor core id

- a typical atom for scheduling :

$$\Phi_{u, \hat{u}} : s(u) + C(u) \leq s(\hat{u})$$

task u comes before task \hat{u}

- **Constraint I** : Precedence in graph (U, \mathcal{E}) :

$$\text{for } (u, \hat{u}) \in \mathcal{E} : \Phi_{u, \hat{u}}$$

Problem Encoding for an SMT Solver (3)

- **Constraint II** : Mutual exclusion of tasks U :

$$\text{for } u \neq \hat{u} \in U : \mu(u) = \mu(\hat{u}) \Rightarrow \Phi_{u,\hat{u}} \vee \Phi_{\hat{u},u},$$

- **Constraint III**: Core Count Cost M

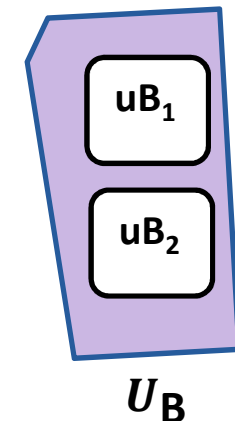
$$\text{for } u \in U : \mu(u) \leq M$$

- **Constraint IV**: Deadline Cost D

$$\text{for } u \in U : s(u) + C(u) \leq D$$

- **Constraint V**: SDF Symmetry Breaking

$$\text{for } v \in V, \text{ actor instances } uV_1, uV_2, \dots \in U_v : \\ s(uV_1) \leq s(uV_2) \leq \dots \leq \dots$$



most efficient in combination with **processor symmetry breaking** (omitted)

Problem Encoding for an SMT Solver (4)

contribution of this paper: **period locality** principle

if the **maximal timespan** of tasks running on the same core

$$s(\hat{u}) + C(\hat{u}) - s(u)$$

fits within the period T then we can guarantee periodic repetition

without processor core conflicts

- **Constraint VI: Period Cost T**

$$\text{for } u, \hat{u} \in U : \mu(u) = \mu(\hat{u}) \Rightarrow s(\hat{u}) + C(\hat{u}) - s(u) \leq T$$

advantages

permits **binary-search on optimal period T**

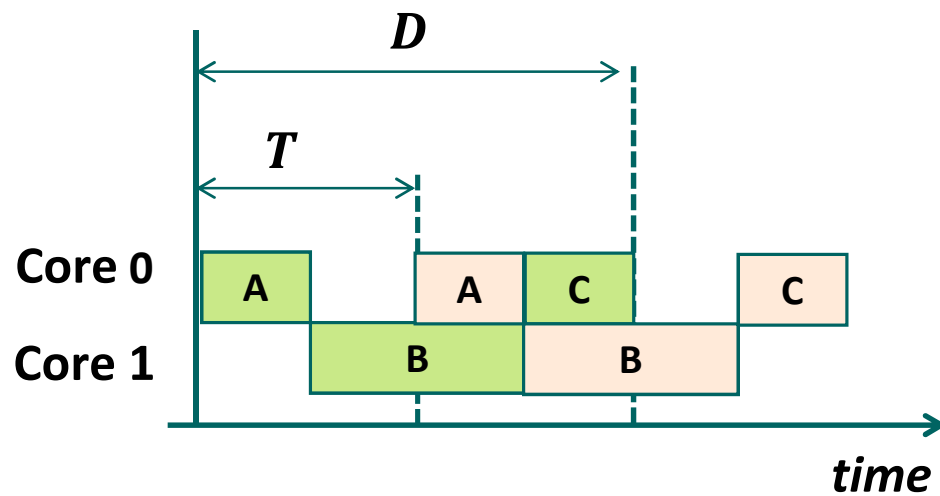
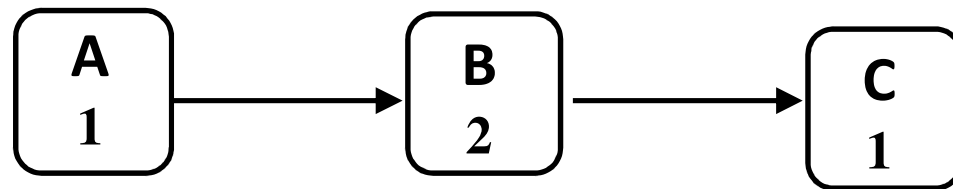
permits **monotonic cost space search** = extensions of binary search

sustainable for sporadic inter-arrival superior to T , keeping the same D

disadvantage

excludes some optimal (but non-sustainable) schedules

Period Locality Counter-example



Experiment Summary

- implemented in our many-core compiler:
StreamExplorer
<http://www-verimag.imag.fr/~poplavko/streamExplorer.html>
- Z3 solver for SMT
- StreamIt application benchmarks
- Kalray MPPA-256 many-core
used a cluster with 16 cores
- Main results:
 - trade-offs between processor count and period
 - 15% maximal timing error of benchmark execution on hardware

Related Work

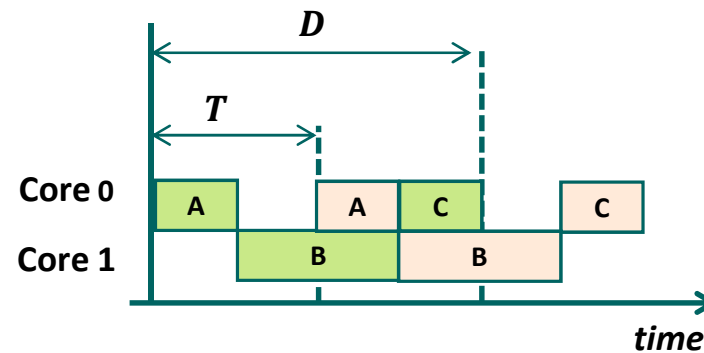
- **DAG-task preemptive scheduling**
 - schedulability analyses developed, see e.g. [Bonifaci ECRTS'13]
 - require preemption
- **SDF scheduling**
 - actor-periodic, see e.g. [Stefanov DATE'14]
 - more restrictive than task-periodic
- **Non-preemptive pipelined scheduling with model checking, ILP, SMT,...**
 - (a) **unfolding** [Legriel ECRTS'11]
 - (b) **modulo scheduling**, e.g. [Lombardi CPAIOR'11]
 - SMT encoding : e.g. our tech rep. [TR-2014-5]
 - previously, for **plain task graphs**, unaware of SDF symmetry
 - **more complex SMT encoding** than period locality
 - may produce **more optimal** but **non-sustainable** results
 - additional experiments show **similar performance**

Conclusions

- **SMT solvers** to address **SDF pipelined scheduling**
- assuming **no preemption**, often the case in DSP and many-core processors, invalidating real-time theory
- **task-periodic**, being more general than actor-periodic, yet SDF symmetry was exploited
- **more restrictive** in theory than previously existing methods
- yet in practice similar performance, and offering **sustainable schedules** and monotonic search

Thank you!

Pipelined Scheduling of Acyclic SDF Graphs using SMT Solvers



$$\mu(u) = \mu(\hat{u}) \Rightarrow s(\hat{u}) + C(\hat{u}) - s(u) \leq T$$

<http://www-verimag.imag.fr/~poplavko/streamExplorer.html>