

Reliable Embedded Multimedia Systems?

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Joint work with

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'Knowing is not understanding.'
Charles Kettering

2 Overview

- Embedded Multi-media
- Analysis of Synchronous Dataflow Graphs
 - Throughput Analysis
 - Throughput-Storage Trade-off Analysis
 - Scenario-aware Analysis
- Run-time Adaptation
- Looking Forward

3 Embedded Multi-media

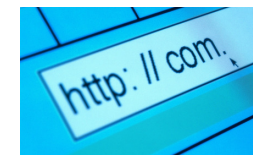
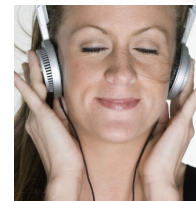


Trends

Concurrency
Connectedness
Interaction
Variability

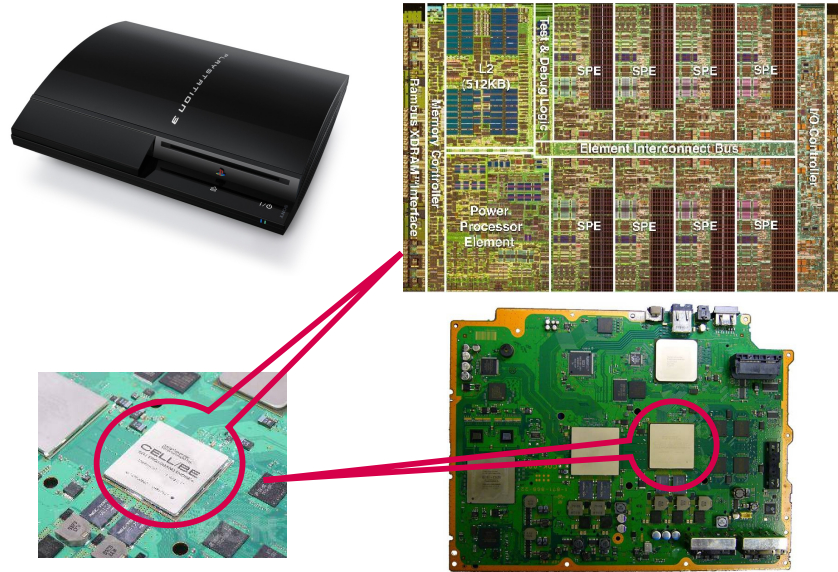
emb. mm → throughput → storage → scenarios → adaptation → the future

4 Embedded Multi-media



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5 Embedded Multi-media



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6 Embedded Multi-media



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7 Approach: Models of Computation (MoCs)

on the interface between science and engineering essential for predictability

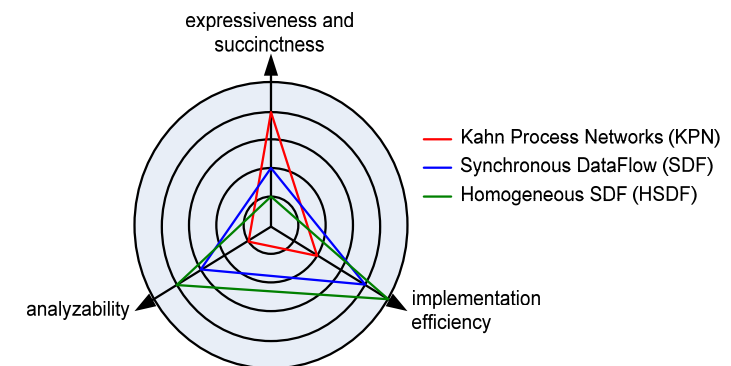
Basic dimensions	Aspects	Metrics
processing	functionality concurrency timing energy quality ...	execution time energy dissipation
communication	functionality concurrency timing energy quality ...	perceived quality
storage	functionality concurrency timing energy quality ...	reconfiguration time ...

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8 Essential Challenges

predictability and efficiency

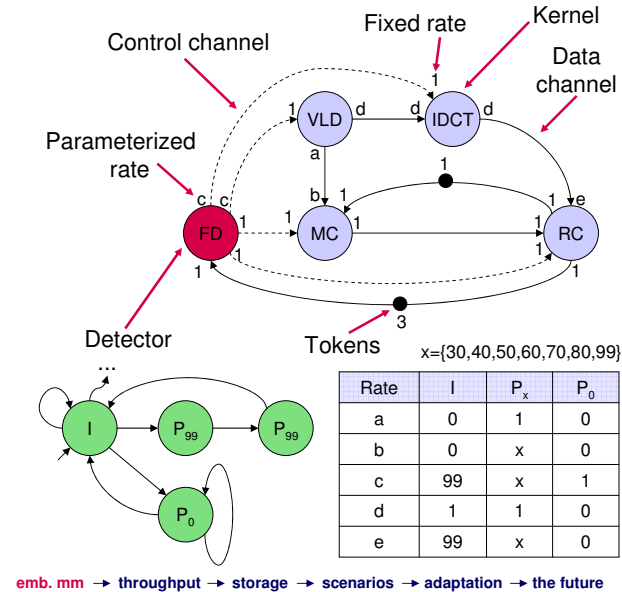
... are contradictory



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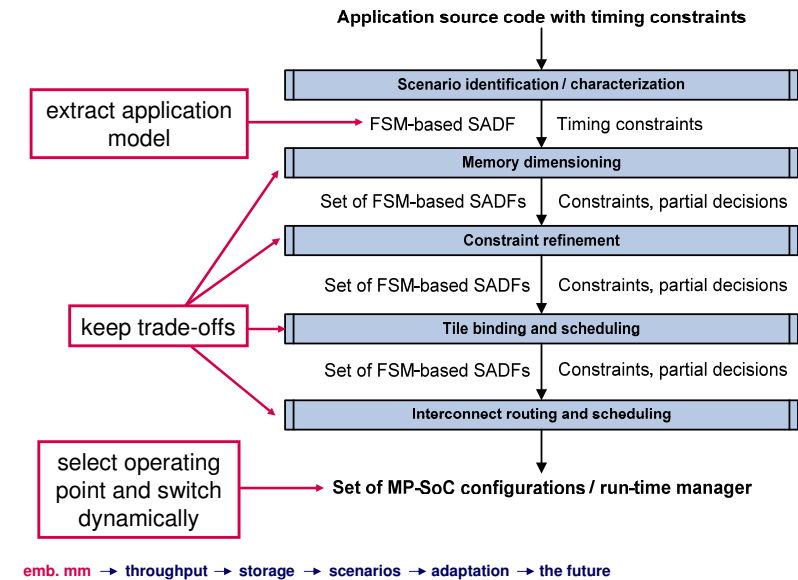
9 Scenario-aware H.263 Decoder Model

(FSM-based Scenario-Aware DataFlow (SADF))



MEMOCODE 2006

10 The Goal: Scenario-aware Flow

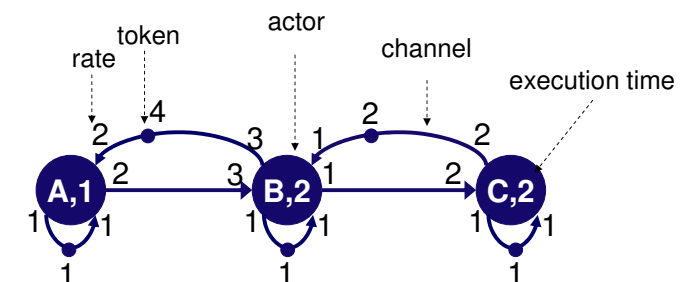


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12 Synchronous Data Flow Graphs

(SDFGs [Lee 1986])



Throughput: average number of actor firings over time

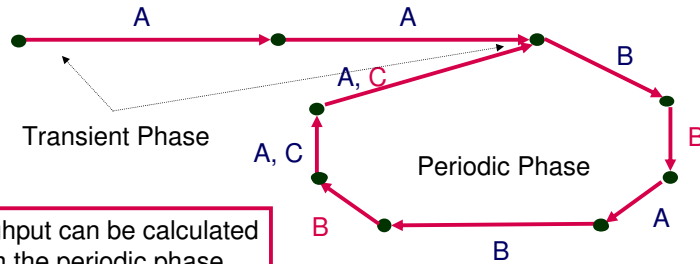
Iteration: smallest non-empty set of actor firings that does not change the token distribution (example: A:3, B:2, C:1)

ACSD 2006

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13 Our Throughput Analysis Method

- Self-timed execution:
 - Each actor fires as soon as it can fire
 - Known to maximize throughput
- Execution state: distribution of tokens + remaining execution times
- Execution: transient + periodic phase



Efficient implementation

Consider **one designated firing per iteration only** to detect a recurrent state

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14 Throughput Analysis: Our Result

	State Space	Traditional methods, all using conversion to Homogeneous SDFGs		
		Dasdan Gupta	Howard	Young Tarjan Orlin
MP3 dec.	1.10^{-3}	1.10^{-3}	1.10^{-3}	1.10^{-3}
Modem	1.10^{-3}	82.10^{-3}	81.10^{-3}	81.10^{-3}
Sample Rate	2.10^{-3}	>1800	>1800	>1800
Satellite	56.10^{-3}	>1800	>1800	>1800
H.263 decoder	10.10^{-3}	>1800	>1800	>1800

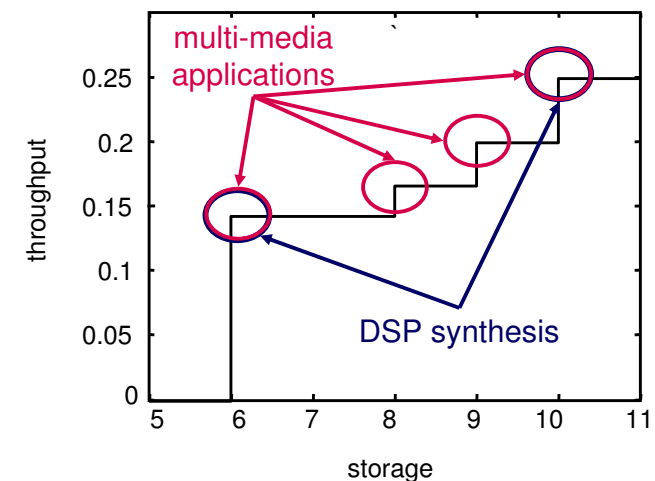
Runtimes of various throughput analysis methods (in seconds)

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16 Trade-off: Storage vs. Throughput



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17 Storage Distribution

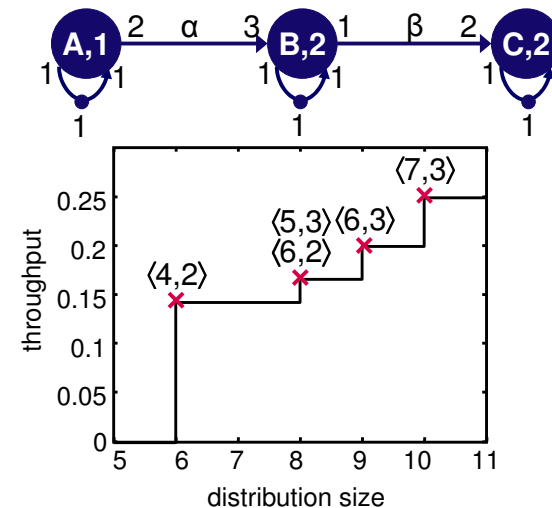


Tokens on channels must be stored in memory.

- Separate memory for each channel.
- Storage distribution, for example, $\langle \alpha, \beta \rangle \rightarrow \langle 4, 2 \rangle$

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18 Problem Definition



Find all minimal storage distributions for any possible throughput

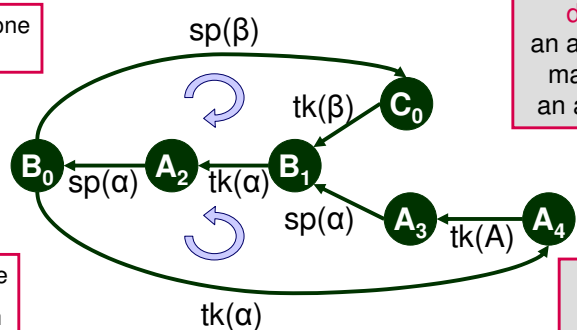
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19 Dependency Graph



Storage distribution $\langle \alpha, \beta \rangle \rightarrow \langle 4, 2 \rangle$

firings in one period



dependency:
an actor firing start
may depend on
an actor firing end

sp - space
tk - token

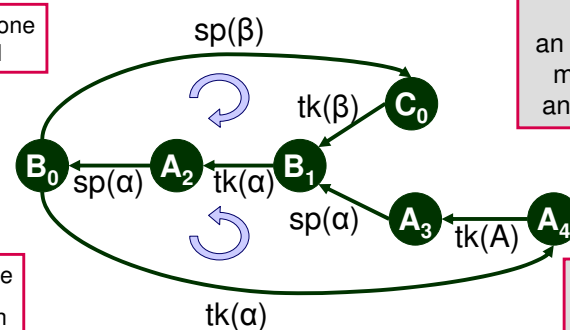
cycles denote
storage
dependencies

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20 Dependency Graph

resolving storage dependencies may increase throughput

firings in one period



dependency:
an actor firing start
may depend on
an actor firing end

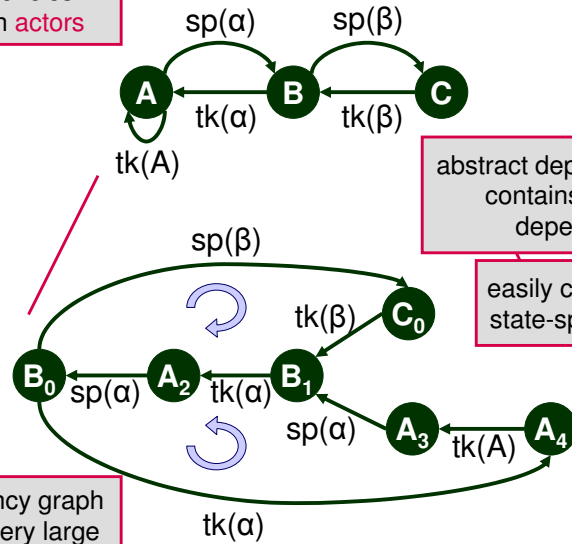
sp - space
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cycles denote
storage
dependencies

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21 Abstract Dependency Graph

dependencies
between **actors**



abstract dependency graph
contains all storage
dependencies

easily constructed from
state-space exploration

dependency graph
may be very large

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22 Design-Space Exploration Algorithm

Given an SDFG G with storage distribution δ

1. Compute throughput and abstract dependency graph Δ for G with δ
2. For each channel c with a storage dependency in Δ
Create new storage distribution by enlarging c
3. Repeat steps 1-2

All minimal storage distributions are found
when starting from storage distribution $\langle 0, \dots, 0 \rangle$

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23 Experimental Results

	Example	Satellite	MP3	H.263
#actors	3	22	13	4
#channels	2	26	12	3
min throughput > 0	1/7	0.18	1/137	1/21876
Distr. size	6	1542	12	4753
Max through	Approximation increase buffers with n times the minimal step size			1/10000
Distr. size				8006
#Pareto points				3254
#Distributions	5	2	3	3254
Exec. time	1ms	7ms	2ms	53min

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24 Conclusions Trade-off Analysis

- Exact minimum memory requirements for any possible throughput
- Technique can be combined with heuristics to prune the search space if necessary
- Technique can be generalized to other types of resources and performance metrics

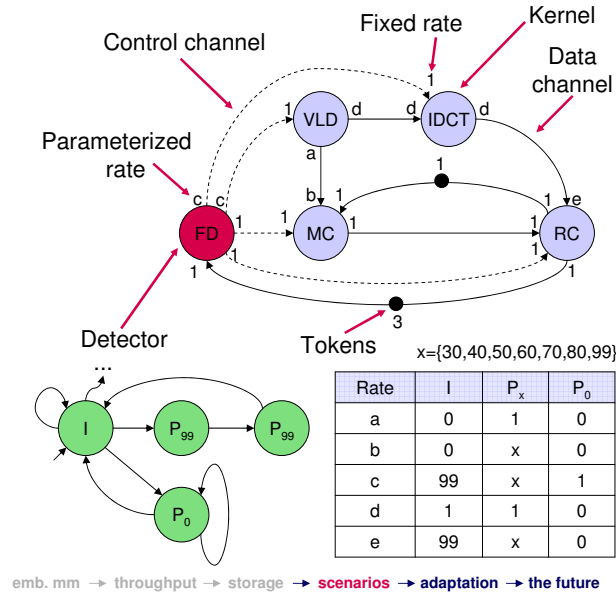
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26 Scenario-aware H.263 Decoder Model

(FSM-based Scenario-Aware DataFlow (SADF))

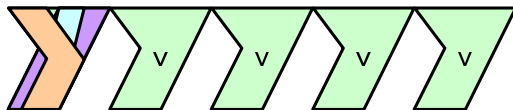


Execution time		
VLD	P ₀	0
	others	40
IDCT	P ₀	0
	others	17
MC	I, P ₀	0
	P ₃₀	90
	P ₄₀	145
	P ₅₀	190
	P ₆₀	235
	P ₇₀	265
	P ₈₀	310
	P ₉₉	390
RC	I	350
	P ₀	0
	P ₃₀ , P ₄₀ , P ₅₀	250
	P ₆₀	300
FD	P ₇₀ , P ₈₀ , P ₉₉	320
	All	0

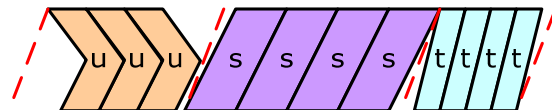
MEMOCODE 2006

27 Scenario-aware Performance Analysis

- SDF-based throughput analysis considers worst-case actor times



- Scenario-aware throughput analysis considers worst-case actor times per scenario, but it must consider scenario transitions



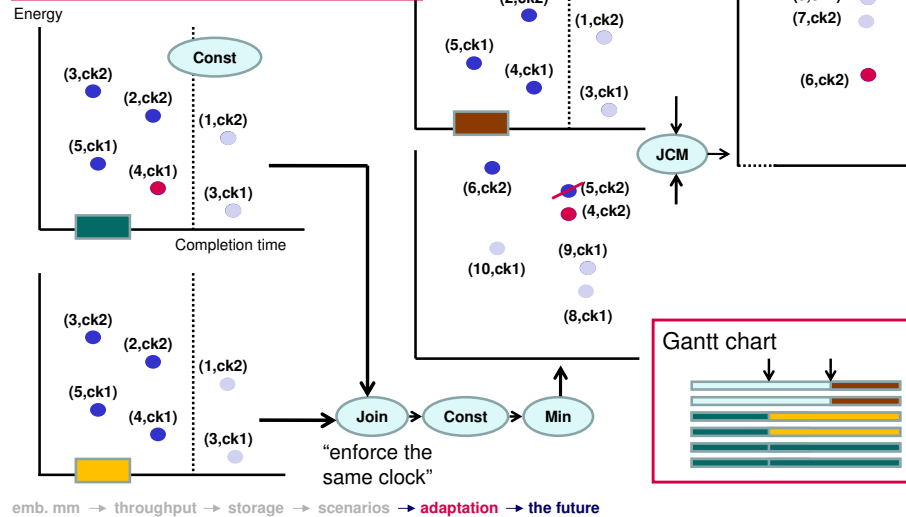
- Analyzing all scenario transitions separately can be avoided
- Separate scenario transitions with an invariant reference schedule

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29 Run-time Application Management

- Applications starting/stopping over time
- 6 procs, slow (ck1) and fast clocks (ck2)
- Minimize energy under time constraints



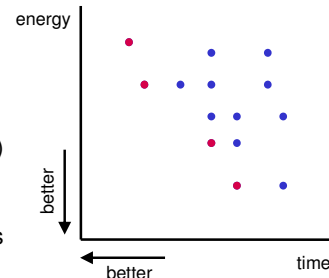
30 Pareto Algebra

Goal: Compositional computation of trade-offs

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31 Pareto Algebra

- The elements: sets of configurations
- (Relevant) operators:
 - **Minimization**
Gives the Pareto points (optimal trade-offs)
 - **Product**
Cartesian product of configurations
e.g. application and platform configurations
 - **Constraint**
Selects solutions according to constraints
e.g. all application configurations with some minimal quality
 - **Abstraction**
Discards information about solutions
e.g. bandwidth usage in bandwidth × energy × quality configurations
 - **Derived metric**
Derive a new metric from other metrics
e.g. total power from power of components

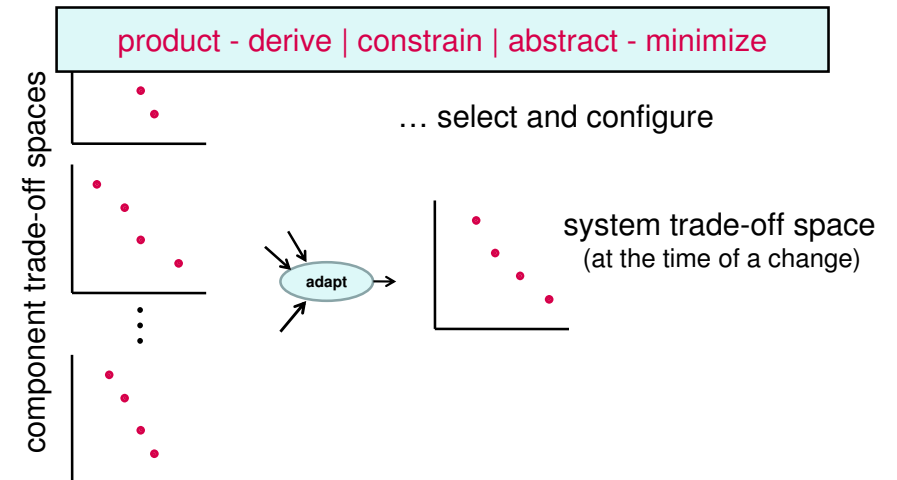


prerequisite
monotonicity

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32 Pareto-Algebraic Characterization

... of run-time adaptation



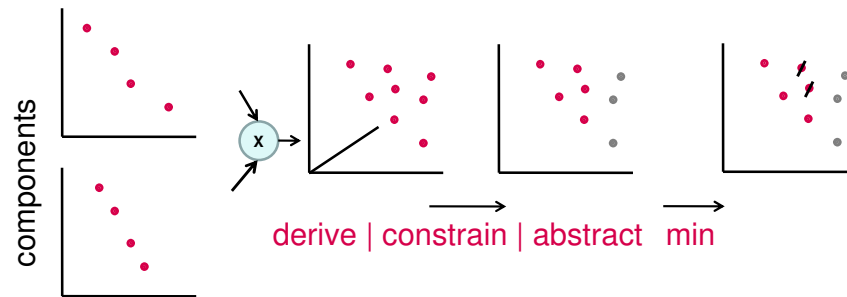
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33 Pareto-Algebraic Characterization

... of run-time adaptation

product - derive | constrain | abstract - minimize

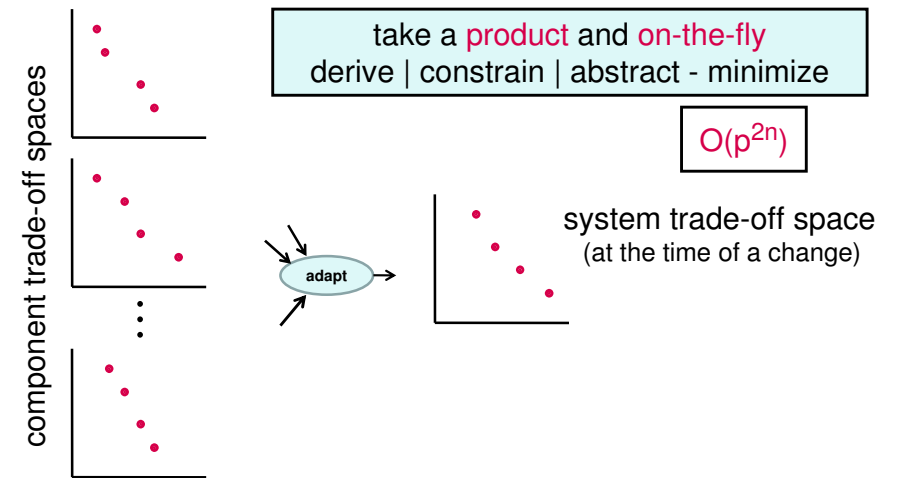
... select and configure



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34 Complexity

n components with p Pareto points each



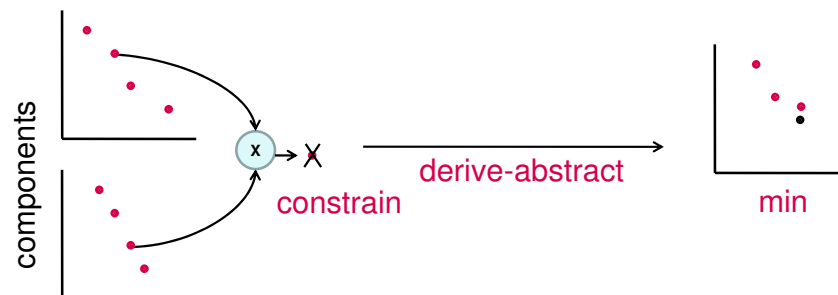
emb. mm → throughput → storage → scenarios → adaptation → the future

35 Complexity

n components with p Pareto points each

take a product and on-the-fly
derive | constrain | abstract - minimize

$O(p^2n)$

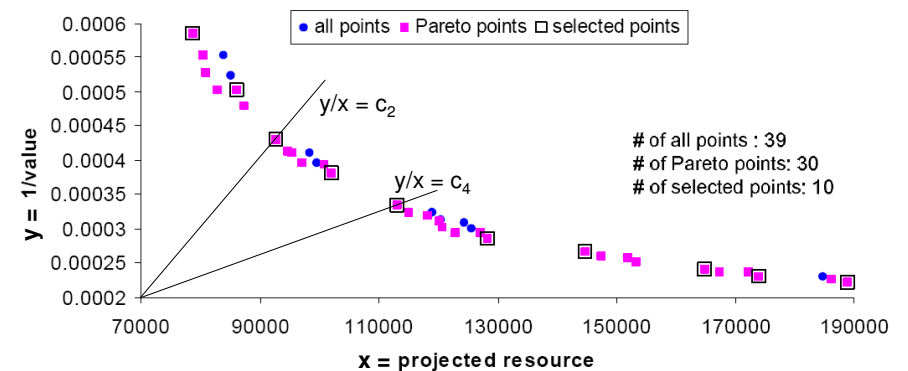


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36 Complexity Control

keep n and p small

- Compositional reasoning, among others
- Approximate Pareto sets



motivation → Pareto algebra → adaptation → cmp → wsn → conclusions

37 Multi-dimensional Multiple-choice Knapsack Problem

MMKP

- One optimization objective (value)
- Multiple resource dimensions with capacity constraints
- Multiple independent applications
- Multiple independent configurations per application

Pick one configuration per application optimizing value within constraints

NP hard

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38 A Parameterized Compositional Heuristic

Embedded Systems
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- Project all resource dimensions into one dimension
- Approximate Pareto set in 2-dimensional space

product
constrain
derive
abstract
minimize

Compute product while on-the-fly

- Applying resource constraints
- Computing values, projecting all resource dimensions into one (taking simply the sum)
- Minimizing the configuration set in 2-dimensional space

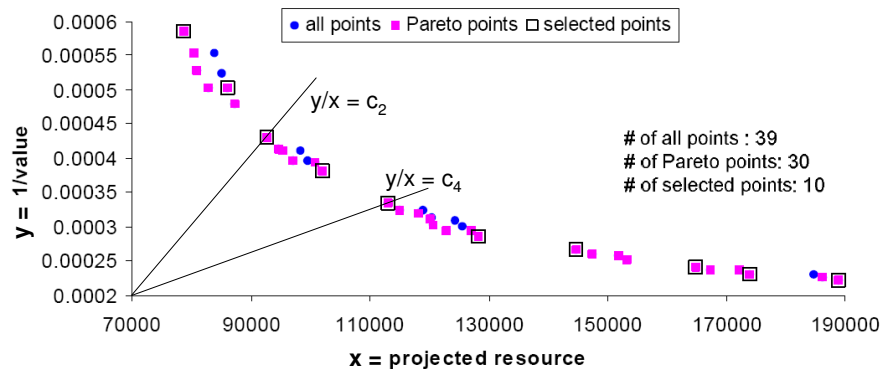
product-constrain-derive-abstract-minimize

emb. mm → throughput → storage → scenarios → adaptation → the future

39 A Parameterized Compositional Heuristic

Embedded Systems
INSTITUTE TU/e

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product-constrain-derive-abstract-minimize

emb. mm → throughput → storage → scenarios → adaptation → the future

40 A Parameterized Compositional Heuristic

Embedded Systems
INSTITUTE TU/e

- Project all resource dimensions into one dimension
- Approximate Pareto set in 2-dimensional space

parameter **p**: maintain (at most) **p** Pareto points

Allows to **budget analysis time**

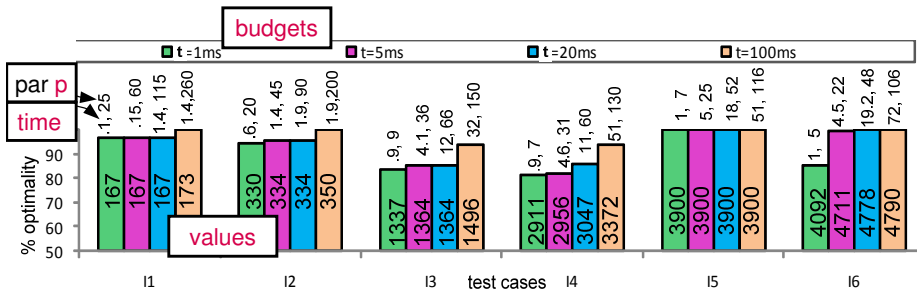
$$\text{analysis time} \leq c \cdot n \cdot p^2$$

(*n* number of applications; *c* platform constant)

product-constrain-derive-abstract-minimize

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41 Controlling Time Budgets

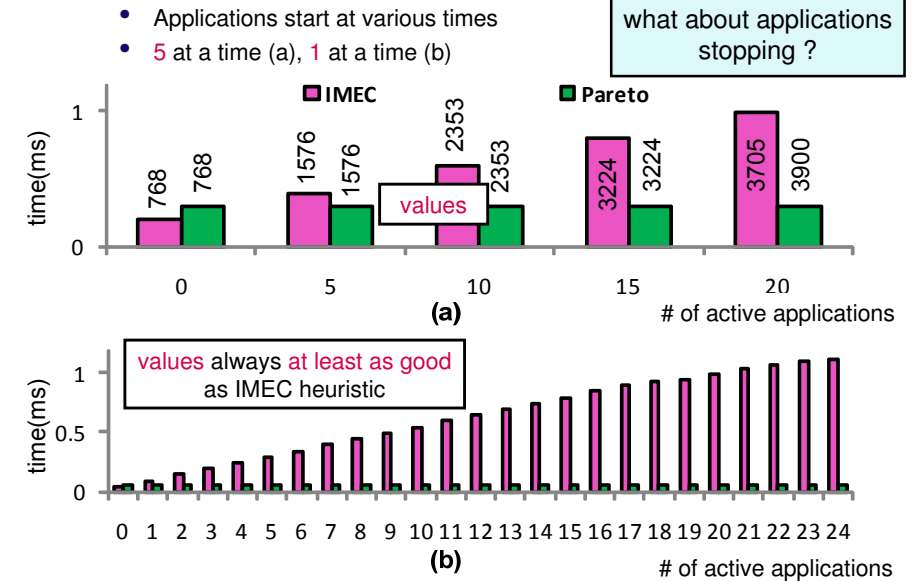


- MMKP benchmark: www.laria.u-picardie.fr/hifi/OR-Benchmark/MMKP
- Always within budget
- Good values
- Similar results to the IMEC, SOC 2006, non-compositional state-of-the-art heuristic

SimIt-ARM simulator
206 Mhz StrongARM

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42 Compositionality



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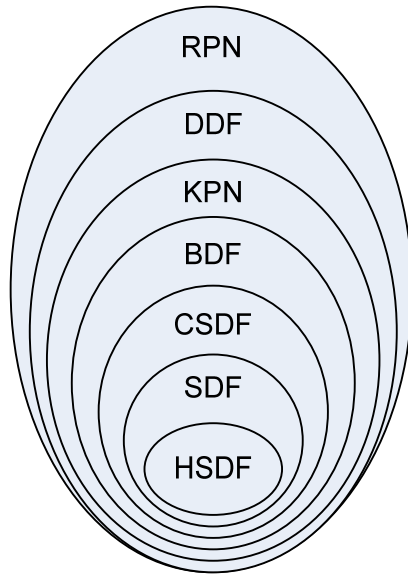
43 Conclusions Run-time Adaptation

- Run-time adaptation:
product - derive | constrain | abstract - minimize
... select and configure
- Parameterized compositional method
 - Allows to trade off quality with analysis time
 - Allows to bound analysis time
 - Open question: components leaving the composition ?
- Feasible for resource-constrained embedded systems
- Wide variety of applications

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- BDF and larger: Turing complete
- Better notions of expressiveness needed
- Unification needed

RPN: Reactive Process Networks
 KPN: Kahn Process Networks
 DF: DataFlow
 DDF: Dynamic DF
 BDF: Boolean DF
 CSDF: Cyclo-Static DF
 SDF: Synchronous DF
 HSDF: Homogeneous SDF

emb. mm → throughput → storage → scenarios → adaptation → the future

- Suitable notions of expressivity
- Expressivity while maintaining analyzability and synthesizability
- Abstraction without losing accuracy
- Composability and compositionality
- MoCs for non-functional aspects
- Unification of MoCs
- Multi-objective trade-off analysis
- Parametric analysis
- Model-driven design and synthesis flows
- Model-driven run-time systems

emb. mm → throughput → storage → scenarios → adaptation → the future

Questions ?

More info: www.es.ele.tue.nl/~tbasten/
 SDF3 toolkit: www.es.ele.tue.nl/sdf3/
 Pareto calculator: www.es.ele.tue.nl/pareto/

‘An understanding of the natural world and what's in it
 is a source of not only a great curiosity but great fulfillment.’
 David Attenborough