

**F2**

**Formal Methods in System and MpSoC Performance  
Analysis and Optimisation**



**DATE 08 TUTORIAL NOTES**



# Formal methods in system and MpSoC performance analysis and optimization

Part 1 - introduction to formal platform performance analysis



Rolf Ernst, TU Braunschweig

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## Overview

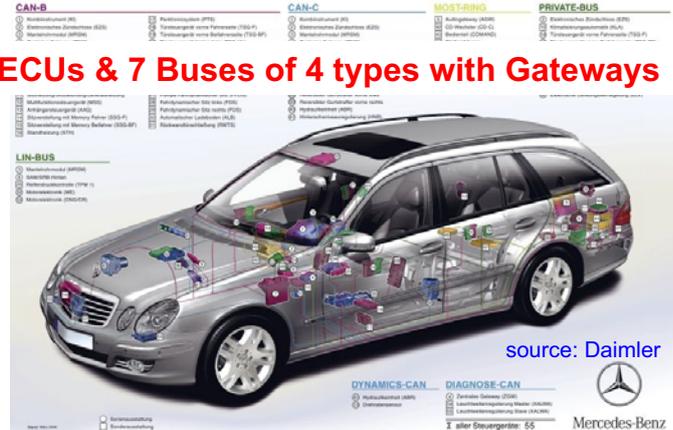
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- **applications for formal performance analysis methods**
- formal performance modeling and analysis principles
- modeling activation and event streams
- component analysis
- system analysis
- enhancements to the basic analysis
- summary and comparison
- conclusion

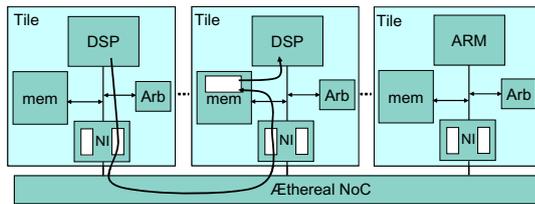
# Formal Model Applications

- formal models for performance analysis optimization are in use for very different types of embedded system
  - distributed networks

**55 ECUs & 7 Buses of 4 types with Gateways**



- MpSoC



source: Bekooj – this tutorial

# Applications of Formal Methods for Performance

- architecture design in early design phases
- design verification
- control and optimize design „robustness“ throughout the design process

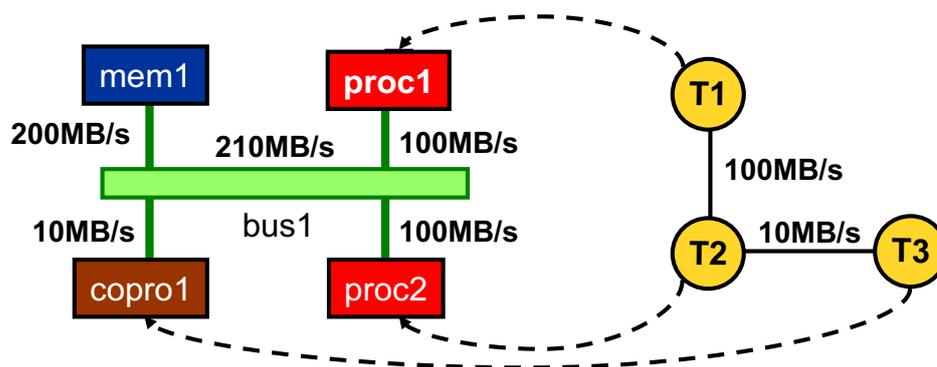
## Current Practice in Early Design Space Exploration

- early design phases
  - determine architecture and communication
  - executable code not yet (completely) available
  - preliminary estimations on task structure and communication volume derived
    - from application models
    - reused SW and HW components
    - and standard component data sheets
- several simple spreadsheet models in practical use
  - e.g. textbook formula for computer networks (Hennessy/Patterson)

$$\begin{aligned} \text{Effective bandwidth} &= \min(2 \times BW_{\text{LinkInjection}}, 2 \times BW_{\text{LinkReception}}) = \\ &= \frac{2 \times \text{Packet size}}{\max(\text{Overhead}, \text{Transmission time})} \end{aligned}$$

## Current Practice - A more Elaborate Simple Model

- reduction of dynamic effects to average or integral values



- allows application of weighted graph algorithms → fast
- frequently used in architecture optimization for distributed networks
- **does not reflect dynamic effects of transient loads, jitter, deadlines, buffer memory**

# Current Practice in Design Verification

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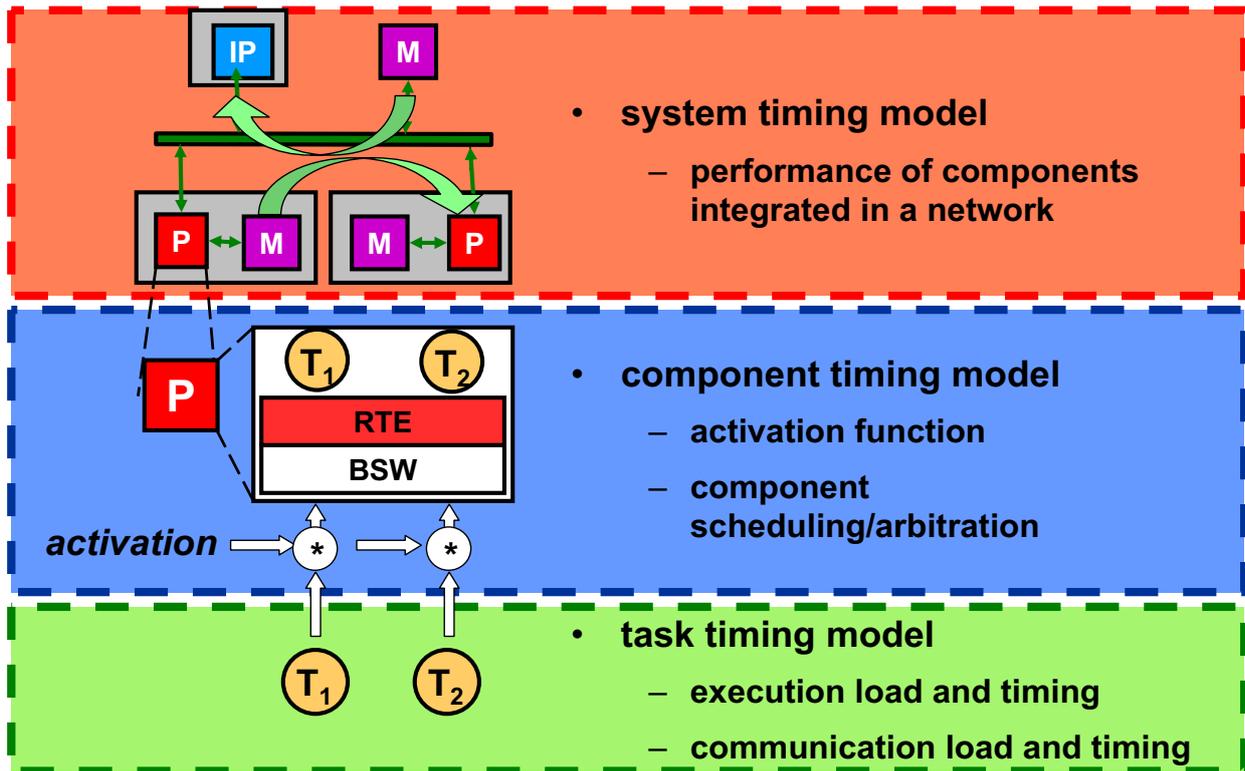
- **extensive simulation**
    - „programmers view“ simulation models based on the ISA
      - function test
    - TLM models to cover HW platform component interaction
      - platform function + approximate timing
    - RTL models
      - platform function + clock cycle accuracy
    - model hierarchy to cover function as well as timing
  - **limitations**
    - high modeling and computation cost for accurate models
    - simulation is always incomplete „case study“
    - concurrency requires accurate timing modeling to cover all effects
    - does not reflect design „flexibility“ to changes, updates, ...
- 
- simulation cost*

## Overview

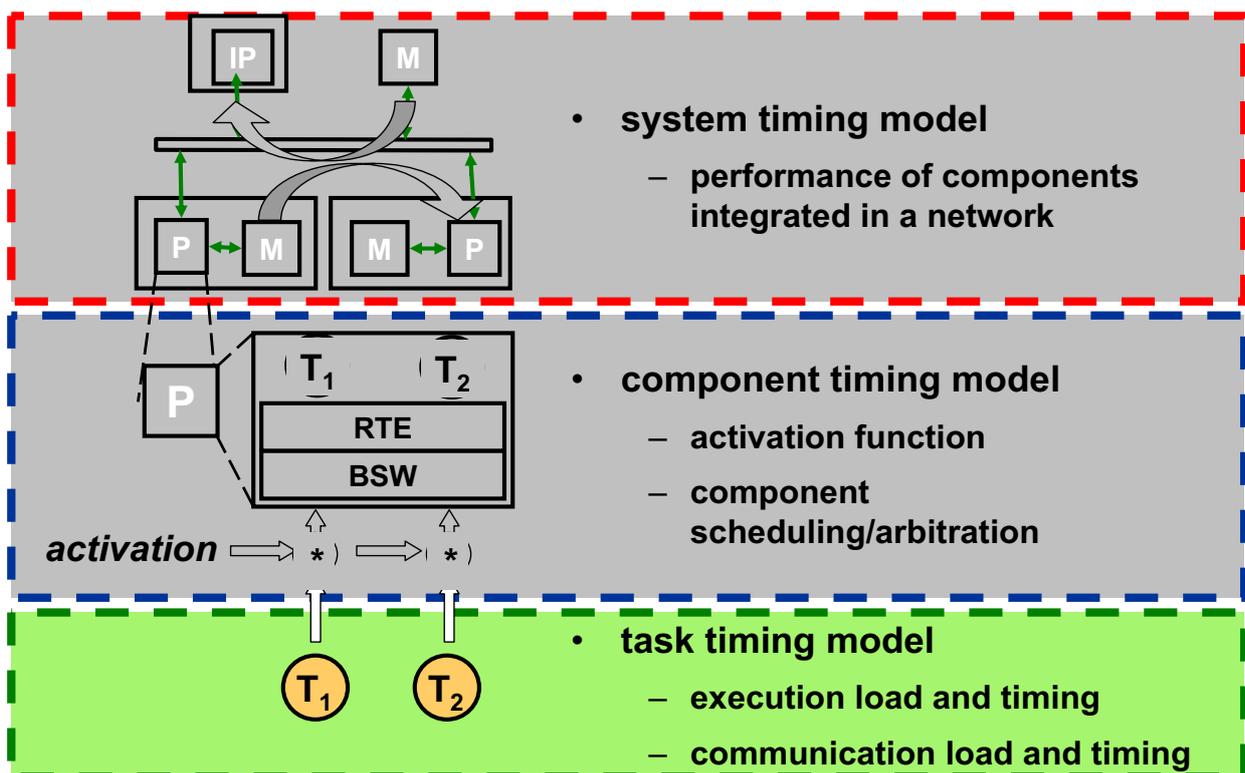
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# Timing Model Hierarchy



# Timing Model Hierarchy - Task



## Formal Modeling Fundamentals – Task Execution

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- ***task core execution time*** is the time needed to execute a given task when running alone on a processor
- **task core execution time does *not* include**
  - operating system overhead
  - the influence of other tasks
  - waiting and synchronization times for global resources
  - shared cache and memory access times (L1 cache often included)
- **task core execution time is determined in different ways**
  - estimated in early design phases
  - measured with a cycle accurate simulator (e.g. CoWare, Vast)
  - measured with instrumented code on a prototype (e.g. dspace)
  - formally analyzed using program path analysis in particular for high safety requirements (e.g. absint)

## Formal Modeling Fundamentals – Communication

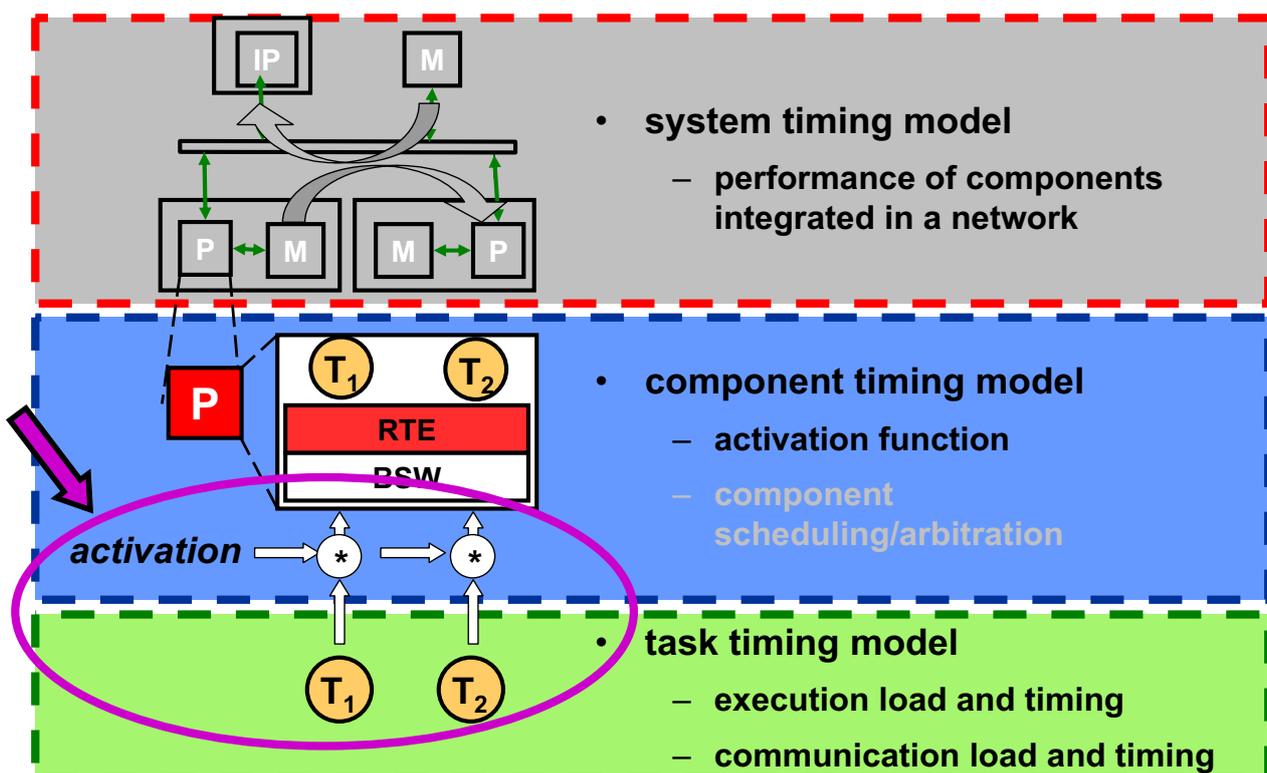
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- ***core communication time*** is the transmission time for a given message to be communicated over a link when no other communication is active
- **core communication time does *not* include**
  - arbitration (scheduling)
  - buffering
  - gateway, multi-hop or MIN timing overhead
- **core communication time is determined in different ways**
  - simulation or prototyping
  - formal model of communication protocol (e.g. Symtavigation)

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- applications for formal performance analysis methods
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## Timing Model Hierarchy - Activation



## Formal Modeling Fundamentals – Activation

- total task load, also called utilization of task  $i$ ,  $U_i$ , depends on activation function

$$\begin{aligned}\text{total task load} &= \text{load/task execution} * \text{task activation frequency} \\ &= \text{task core execution time} * \text{task activation frequency}\end{aligned}$$

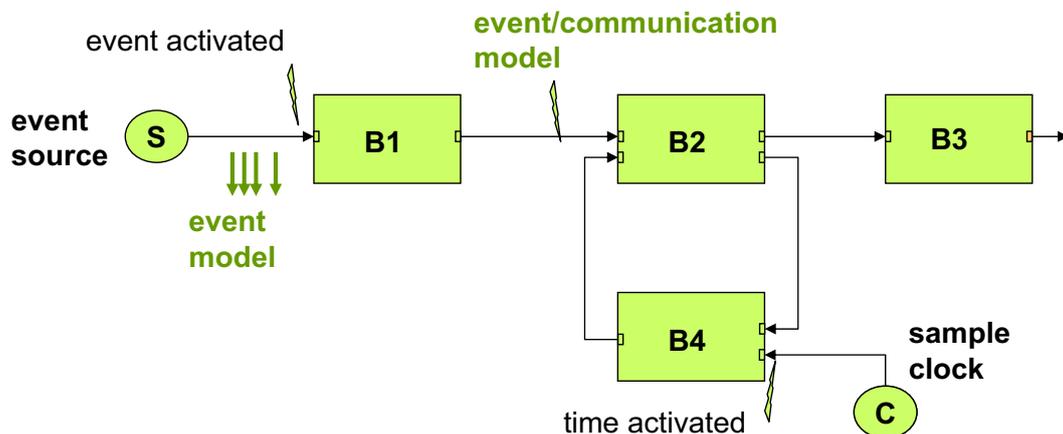
- example: periodic task  $i$  with core execution time  $C_i$  and period  $T_i$

$$U_i = C_i/T_i$$

- what defines the task activation function ?
  - application model (Simulink, SPW, LabView, ...)
  - environment model (reactive systems)
  - service contracts (max no of requests per time, ...)
- typically application rather than platform dependent
  - platform can „modulate“ activation timing to avoid malfunction (e.g. traffic shaping, back pressure)
- two classes of activation – time activation, event activation

## Activation Functions

- two classes of activation
  - time activation – tasks are periodically activated by clock
    - example: periodic sample in signal processing / control eng.
  - event activation – tasks are activated when event arrives
    - example: automata



activation functions - example

## Modeling Events as streams

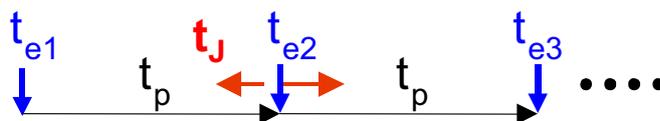
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- in formal performance models, events are modeled as *streams* rather than as sequences of individual events
- examples
  - a clock is given by its period rather than as a sequence of clock ticks
    - clock can be modeled as an event stream
  - a sampled sensor signal is modeled by the sample period and the sample jitter
- the event streams are defined as functions or as parameter tuples

## Popular Event Stream Models – PJD

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- standard event model used in real-time systems
  - event sequences are modeled by three parameters, period  $p$ , jitter  $j$ , and minimum time interval between 2 events
  - important models that can easily be described
    - strictly periodic events (typically clock released)
    - periodic events with jitter
    - sporadic events
    - sporadically periodic events



- covers a large class of applications
- conservatively approximates more complex functions

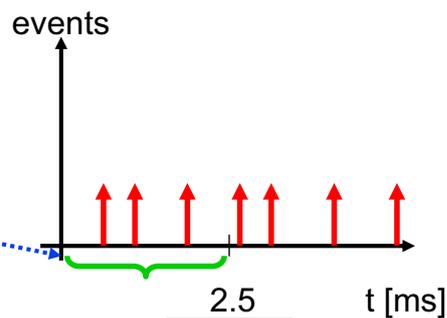
# Popular Event Stream Models - Arrival Curves

- arrival curves of the network calculus
  - captures the no. of event in a time interval  $\Delta t$
  - $\alpha^l(\Delta t)$  is lower bound
  - $\alpha^u(\Delta t)$  is upper bound
- can be used to describe the standard event models
- reaches infinite values for  $\Delta t \rightarrow \infty$ 
  - must be approximated or extended by periodic function for  $\Delta t \rightarrow \infty$
- is when event sequences become very complex, e.g.
  - as a result of operations on event sequences

## Arrival Curves - Example

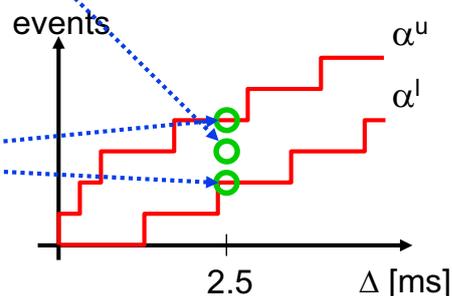
### Event Stream

number of events in  
in  $t=[0 \dots 2.5]$  ms

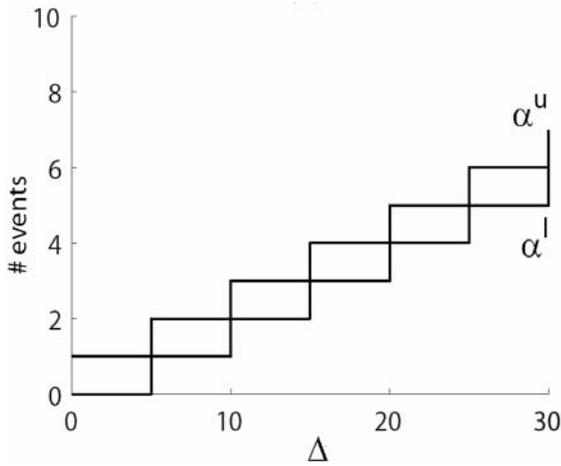


### Arrival Curves

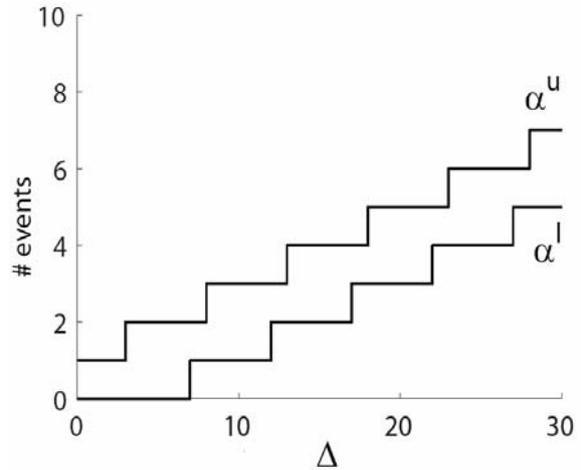
maximum / minimum  
arriving events in *any*  
*interval* of length 2.5 ms



## Example 1: Periodic with Jitter



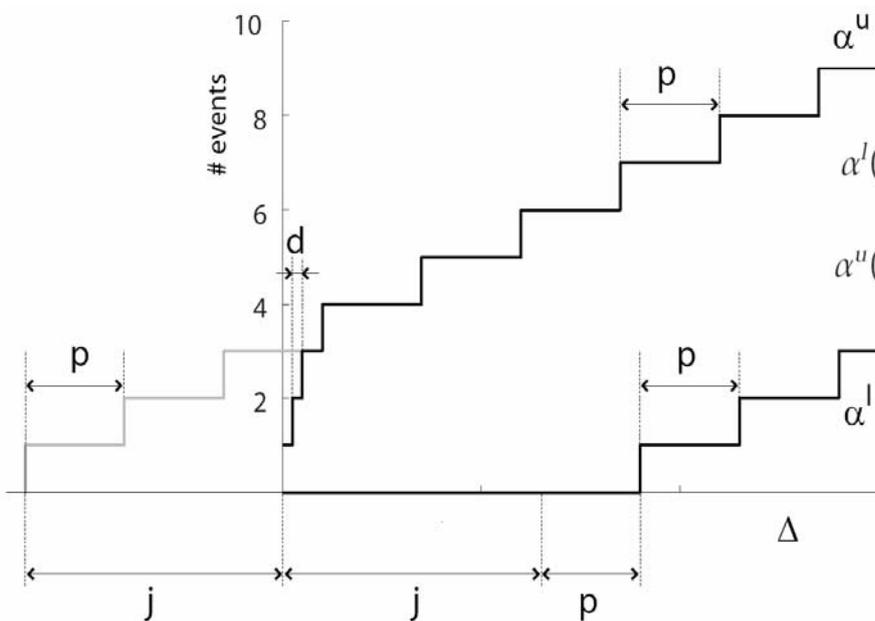
periodic



periodic with jitter

## Example 2: Periodic with Jitter and Minimum Distance d

► *Arrival curves:*

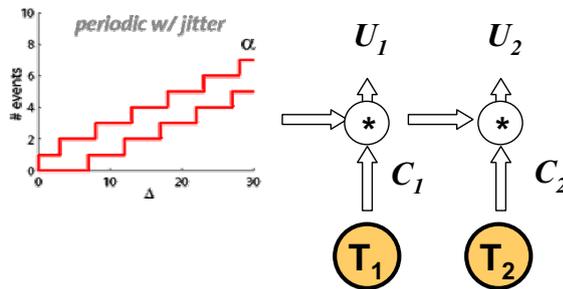


$$\alpha^l(\Delta) = \left\lfloor \frac{\Delta - j}{p} \right\rfloor$$

$$\alpha^u(\Delta) = \min \left\{ \left\lceil \frac{\Delta + j}{p} \right\rceil, \left\lceil \frac{\Delta}{d} \right\rceil \right\}$$

## Total Load of a Task

- with activation model and core execution time or (core communication time), we can now derive the total load of a task

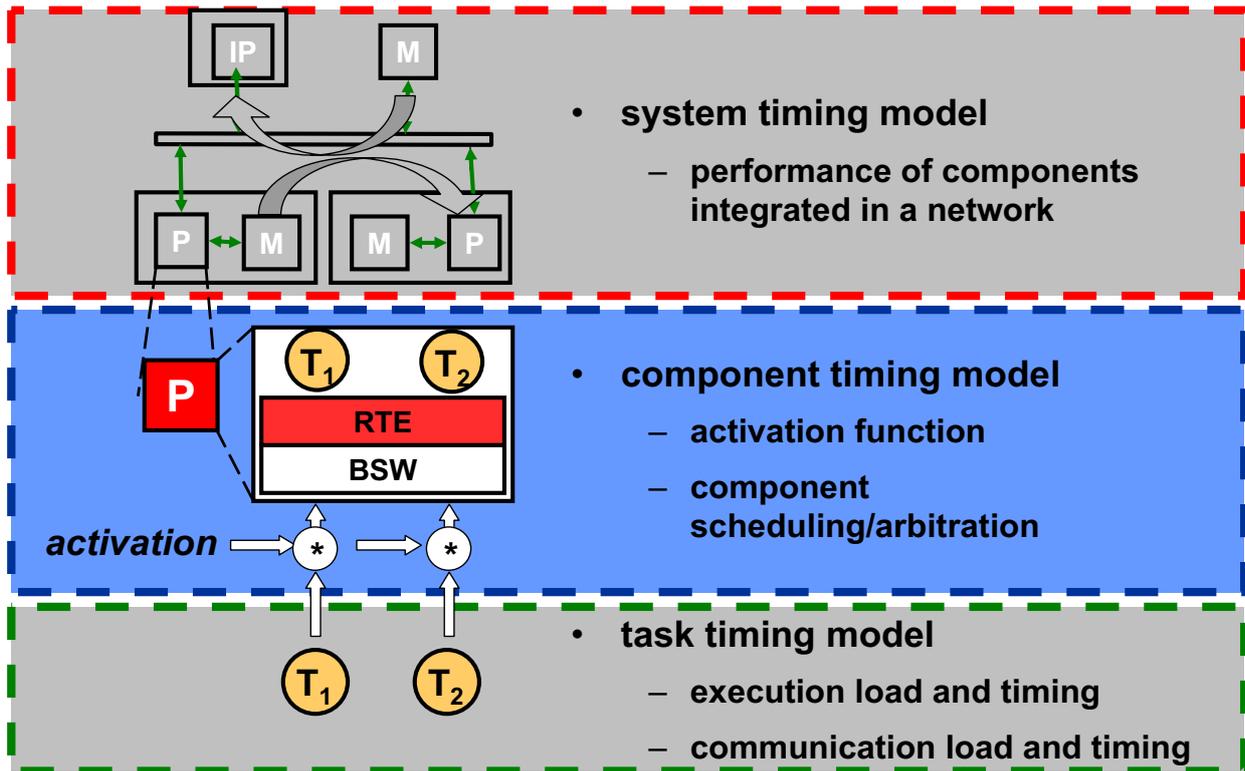


- the resource is not fully available to one task or communication, but is shared with others

## Overview

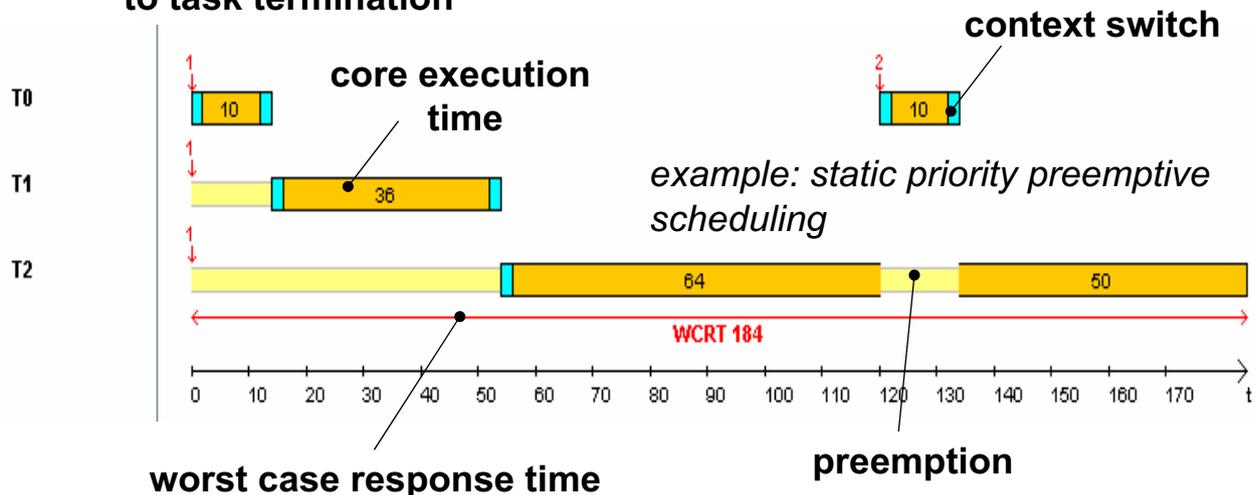
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## Timing Model Hierarchy - Component Timing



## Timing Effects of Scheduling/Arbitration

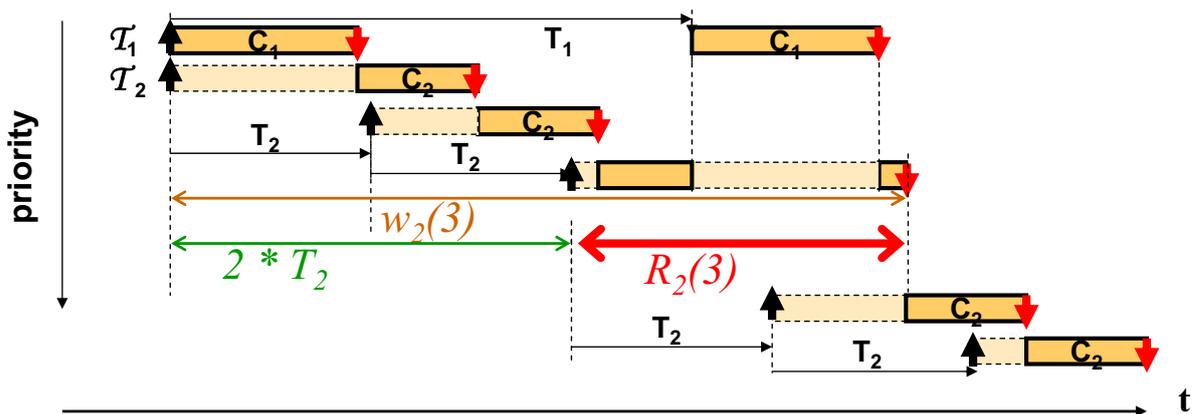
- tasks execute longer than their core execution time
  - time assigned to other tasks
  - operating system overhead
  - context switch, blocking, ...
- response time of a task is maximum from time of activation to task termination



# Scheduling Analysis

- different analysis algorithms
  - generalization of busy window algorithm (Lehoczky, Tindell) to fit general event model (Richter, Jersak, Henia, Racu, Ernst, Schliecker, et al.)
    - Tool SymTA/S
  - extension of Network Calculus to Real-time Calculus (Chakraborty, Wandeler, Künzli, Thiele, et al.)
    - Tool MPA

## Analysis uses “Busy Window” approach

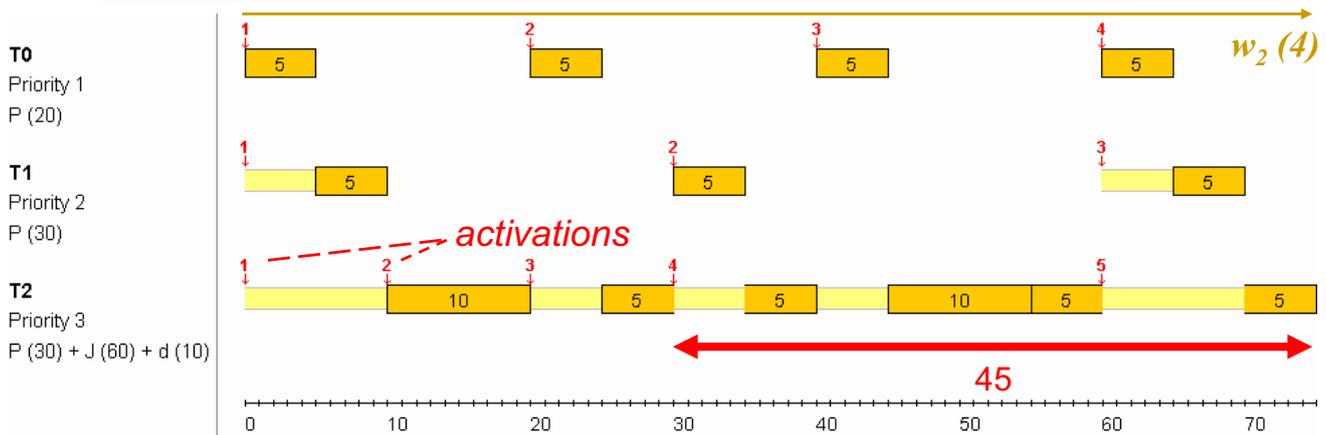


$$w_i(q) = q C_i + \sum_{j \in \text{hp}(i)} C_j \left\lceil \frac{w_i(q)}{T_j} \right\rceil$$

$$R_i(q) = w_i(q) - (q - 1) T_i$$

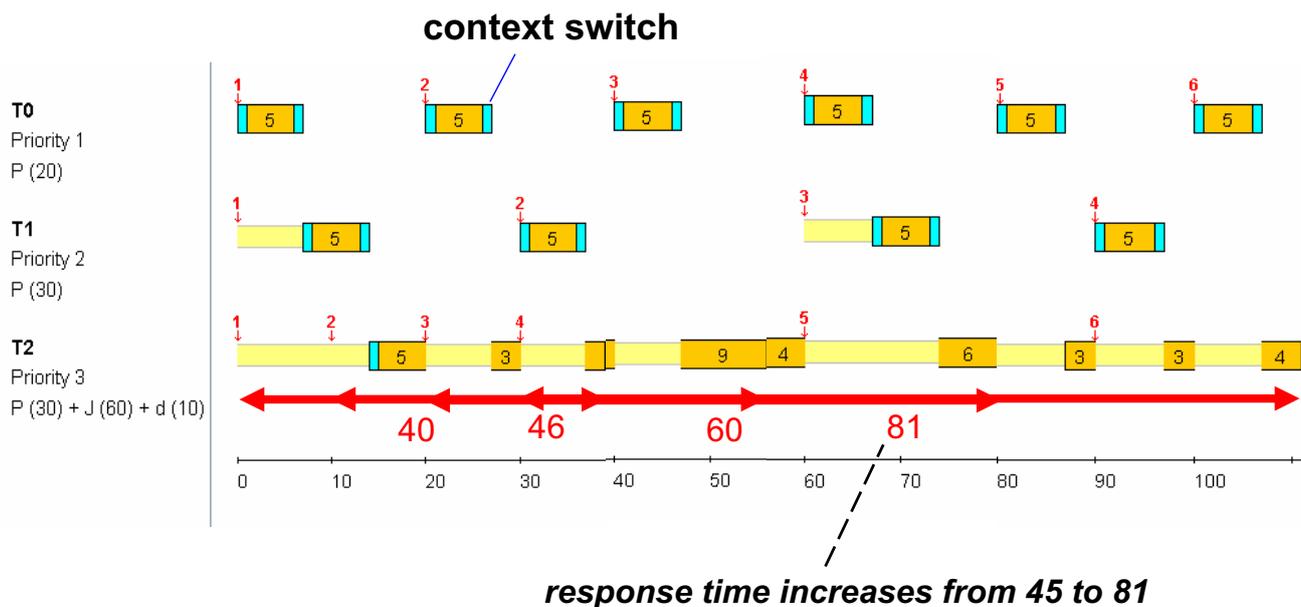
increase  $w_i$  until  
fix point found  
where equations  
hold!

# Busy Window Analysis



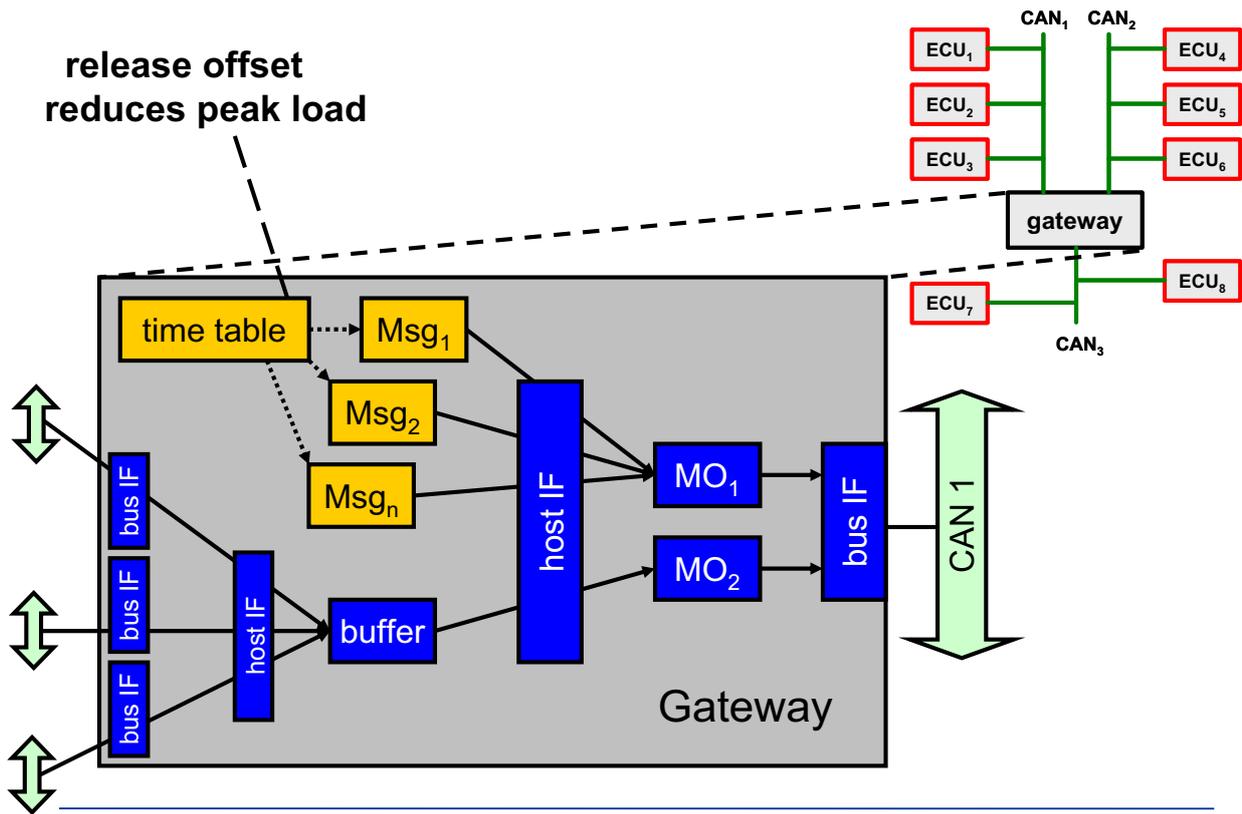
- very versatile approach
- has been extended to analyze even difficult scheduling strategies
  - round-robin, non preemptive, collaborative processes (e.g. OSEK), ...
- can handle unknown worst case (e.g. release offsets – time table)
- can handle stream queues and register communication
- window size increases with load (limited by deadline)
- this window „unrolling“ processes can be considered as **symbolic simulation**

# Importance of Context Switch Consideration

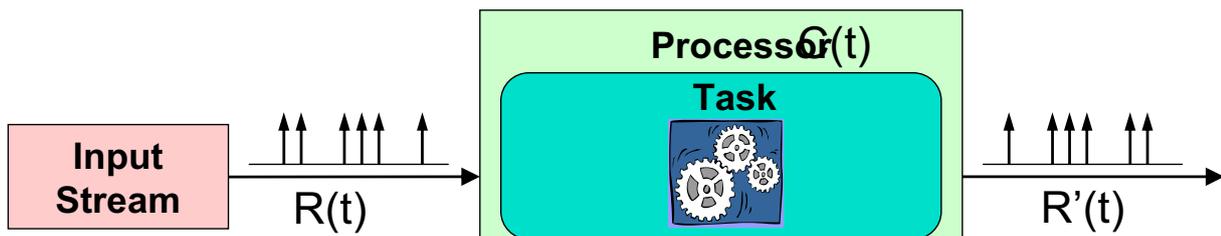


- context switch increases load → non load preserving

# Time Table for Release Offset

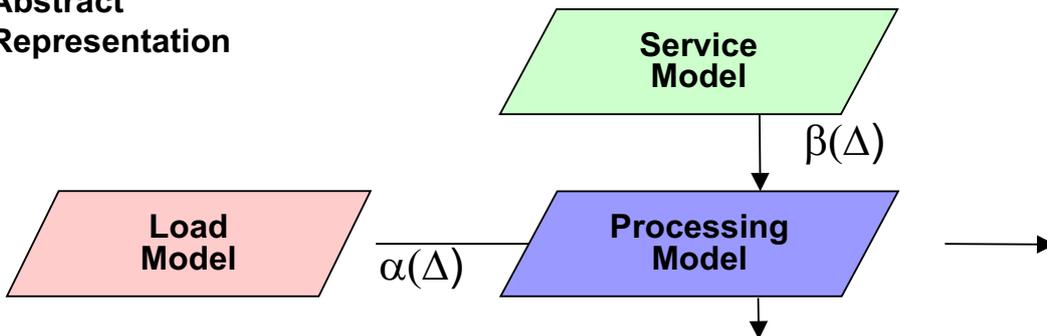


# Real-time Calculus



Concrete Instance

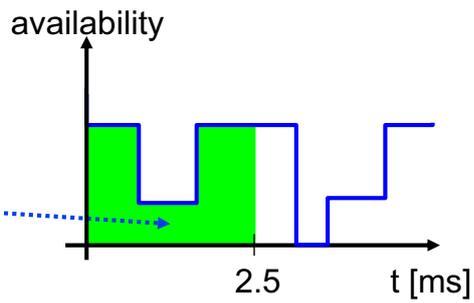
Abstract Representation



# Service Model (Resources)

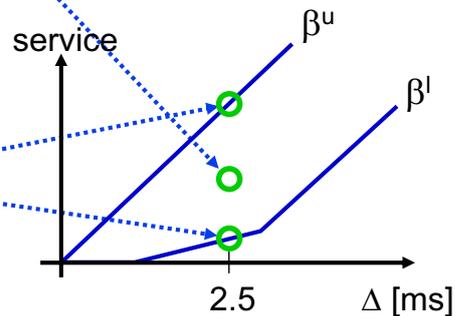
## Resource Availability

available service in  $t=[0 \dots 2.5]$  ms

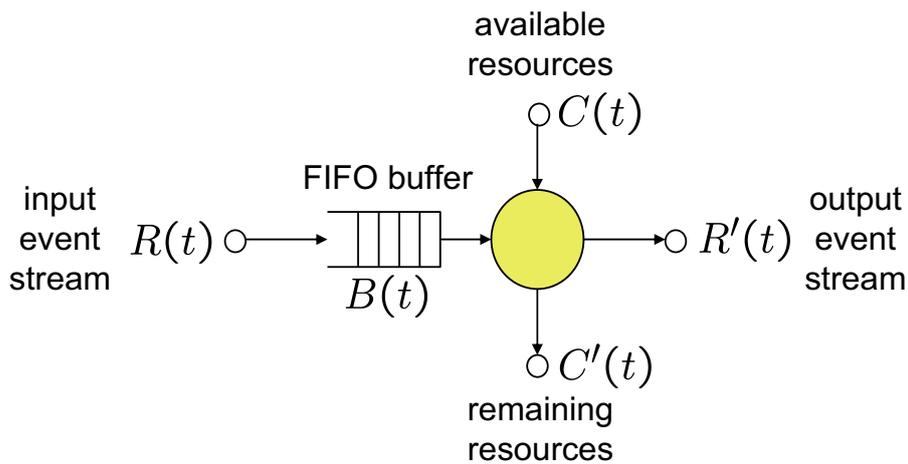


## Service Curves

maximum/minimum available service in *any interval* of length 2.5 ms



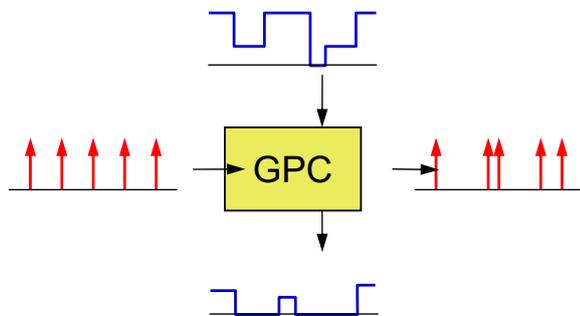
# Greedy Processing Component (GPC)



► **Examples:**

- computation (event – task instance, resource – computing resource [tasks/second])
- communication (event – data packet, resource – bandwidth [packets/second])

## Greedy Processing Component



### Behavioral Description

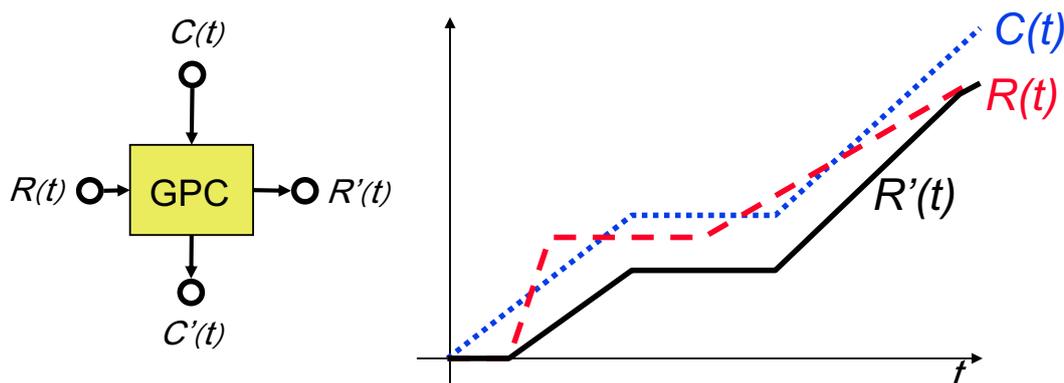
- Component is triggered by incoming events.
- A fully preemptable task is instantiated at every event arrival to process the incoming event.
- Active tasks are processed in a greedy fashion in FIFO order.
- Processing is restricted by the availability of resources.

## Greedy Processing Component (GPC)

If the resource and event streams describe available and requested units of processing or communication, then

$$\left. \begin{aligned} C(t) &= C'(t) + R'(t) \\ B(t) &= R(t) - R'(t) \end{aligned} \right\} \text{Conservation Laws}$$

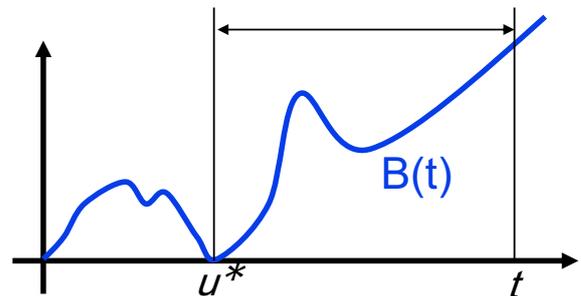
$$R'(t) = \inf_{0 \leq u \leq t} \{R(u) + C(t) - C(u)\}$$



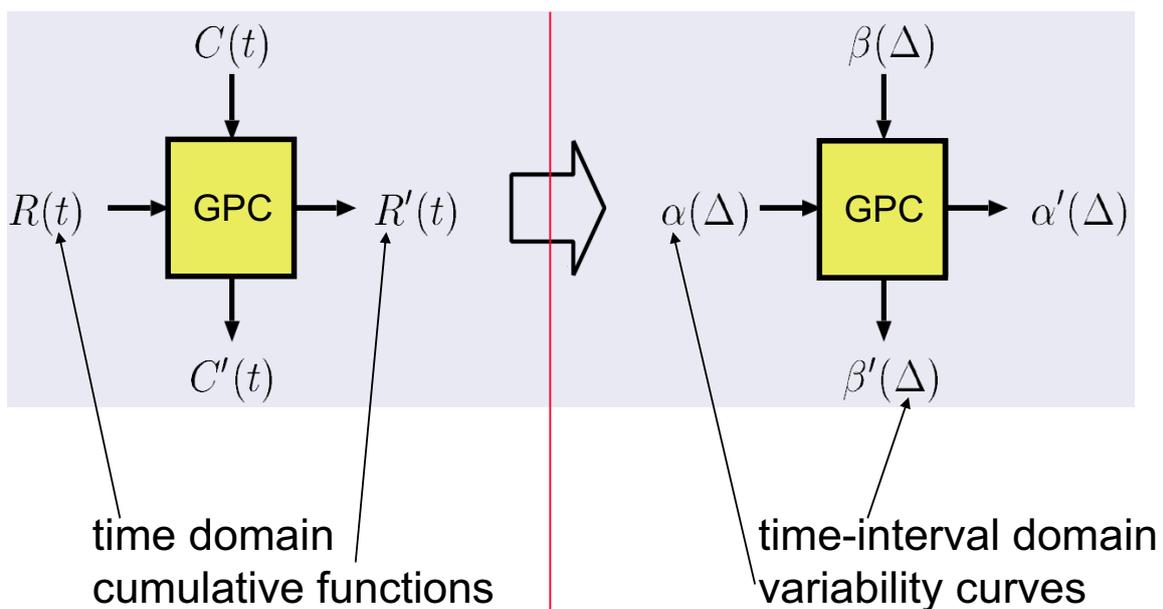
## Greedy Processing

- ▶ For all times  $u \leq t$  we have  $R'(u) \leq R(u)$  (conservation law).
- ▶ We also have  $R'(t) \leq R'(u) + C(t) - C(u)$  as the output can not be larger than the available resources.
- ▶ Combining both statements yields  $R'(t) \leq R(u) + C(t) - C(u)$ .
- ▶ Let us suppose that  $u^*$  is the last time before  $t$  with an empty buffer. We have  $R(u^*) = R'(u^*)$  at  $u^*$  and also  $R'(t) = R'(u^*) + C(t) - C(u^*)$  as all available resources are used to produce output. Therefore,  $R'(t) = R(u^*) + C(t) - C(u^*)$ .
- ▶ As a result, we obtain

$$R'(t) = \inf_{0 \leq u \leq t} \{R(u) + C(t) - C(u)\}$$



## Abstraction



## Some Definitions and Relations

---

- ▶  $f \otimes g$  is called **min-plus convolution**

$$(f \otimes g)(t) = \inf_{0 \leq u \leq t} \{f(t-u) + g(u)\}$$

- ▶  $f \oslash g$  is called **min-plus de-convolution**

$$(f \oslash g)(t) = \sup_{u \geq 0} \{f(t+u) - g(u)\}$$

- ▶ For **max-plus convolution and de-convolution**:

$$(f \bar{\otimes} g)(t) = \sup_{0 \leq u \leq t} \{f(t-u) + g(u)\}$$

$$(f \bar{\oslash} g)(t) = \inf_{u \geq 0} \{f(t+u) - g(u)\}$$

- ▶ Relation between **convolution and deconvolution**

$$f \leq g \otimes h \Leftrightarrow f \oslash h \leq g$$

## The Most Simple Relations

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- ▶ The **output stream** of a component satisfies:

$$R'(t) \geq (R \otimes \beta^l)(t)$$

- ▶ The **output upper arrival curve** of a component satisfies:

$$\alpha^{u'} = (\alpha^u \oslash \beta^l)$$

- ▶ The **remaining lower service curve** of a component satisfies:

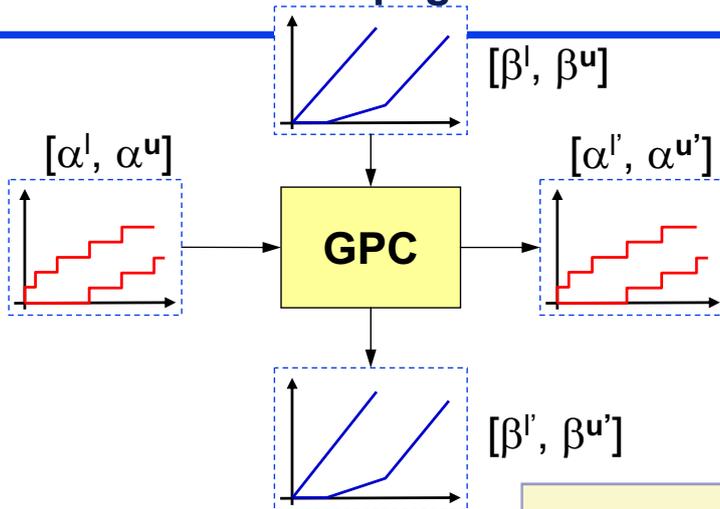
$$\beta^{l'}(\Delta) = \sup_{0 \leq \lambda \leq \Delta} (\beta^l(\lambda) - \alpha^u(\lambda))$$

## Two Sample Proofs

$$\begin{aligned}
 R'(t) &= \inf_{0 \leq u \leq t} \{R(u) + C(t) - C(u)\} \\
 &\geq \inf_{0 \leq u \leq t} \{R(u) + \beta^l(t - u)\} \\
 &= (R \otimes \beta^l)(t)
 \end{aligned}$$

$$\begin{aligned}
 C'(t) - C'(s) &= \sup_{0 \leq a \leq t} \{C(a) - R(a)\} - \sup_{0 \leq b \leq s} \{C(b) - R(b)\} = \\
 &= \inf_{0 \leq b \leq s} \{ \sup_{0 \leq a \leq t} \{ (C(a) - C(b)) - (R(a) - R(b)) \} \} \\
 &= \inf_{0 \leq b \leq s} \{ \sup_{0 \leq a-b \leq t-b} \{ (C(a) - C(b)) - (R(a) - R(b)) \} \} \\
 &\geq \inf_{0 \leq b \leq s} \{ \sup_{0 \leq \lambda \leq t-b} \{ \beta^l(\lambda) - \alpha^u(\lambda) \} \} \geq \sup_{0 \leq \lambda \leq t-s} \{ \beta^l(\lambda) - \alpha^u(\lambda) \}
 \end{aligned}$$

## MPA-RTC – Propagation



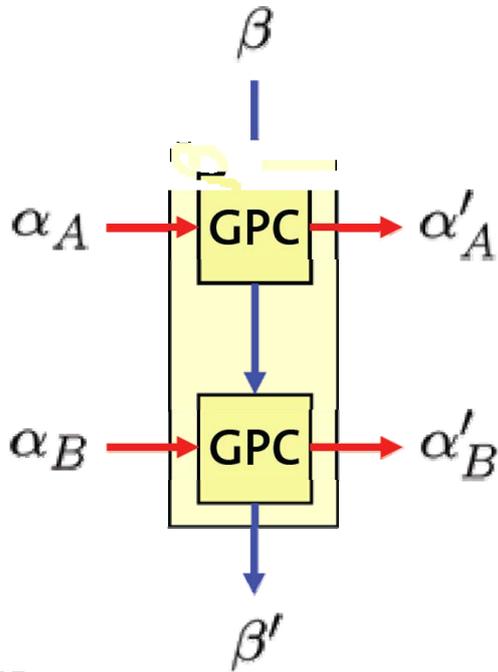
### Real-Time Calculus

$$\begin{aligned}
 \alpha'^u &= \min\{\alpha^u \otimes \beta^u\} \otimes \beta^l, \beta^u\} \\
 \alpha'^l &= \min\{\alpha^l \otimes \beta^u\} \otimes \beta^l, \beta^l\} \\
 \beta'^u &= (\beta^u - \alpha^l) \bar{\otimes} 0 \\
 \beta'^l &= (\beta^l - \alpha^u) \bar{\otimes} 0
 \end{aligned}$$

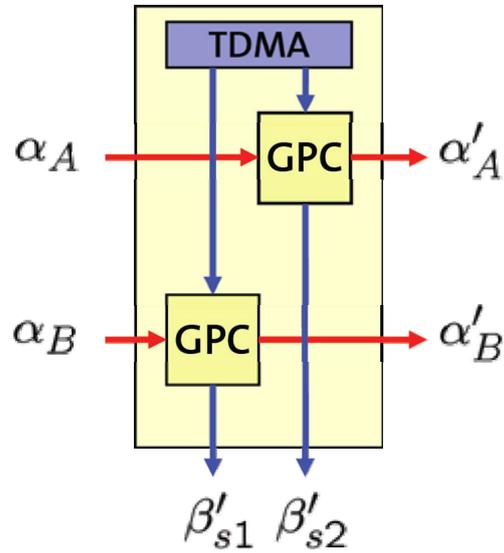
$$\begin{aligned}
 (f \otimes g)(\Delta) &= \inf_{0 \leq \lambda \leq \Delta} \{f(\Delta - \lambda) + g(\lambda)\} \\
 (f \oslash g)(\Delta) &= \sup_{\lambda \geq 0} \{f(\Delta + \lambda) - g(\lambda)\} \\
 (f \bar{\otimes} g)(\Delta) &= \sup_{0 \leq \lambda \leq \Delta} \{f(\Delta - \lambda) + g(\lambda)\} \\
 (f \bar{\oslash} g)(\Delta) &= \inf_{\lambda \geq 0} \{f(\Delta + \lambda) - g(\lambda)\}
 \end{aligned}$$

# MPA-RTC – Scheduling - Examples

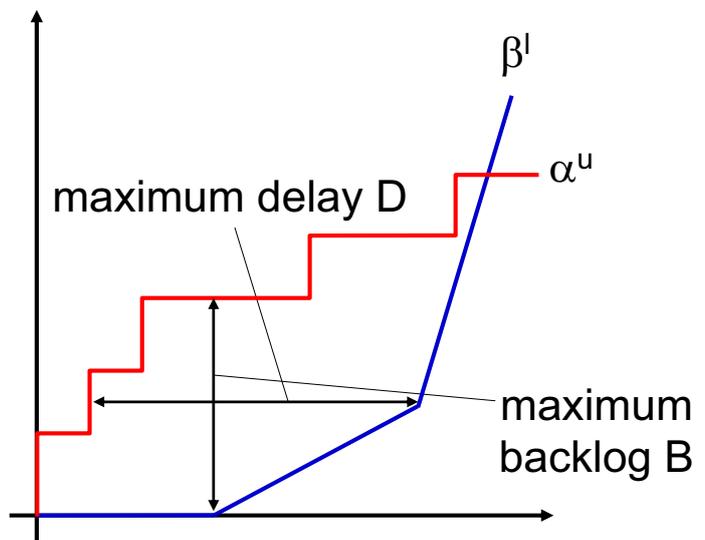
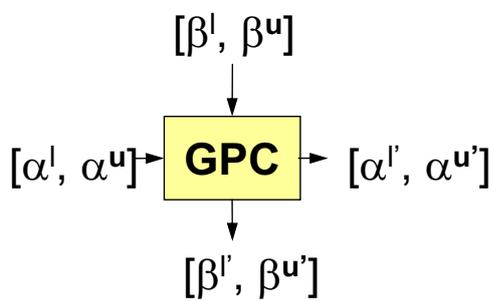
## Fixed Priority Preemptive Scheduling



## Time Division Multiple Access (TDMA)



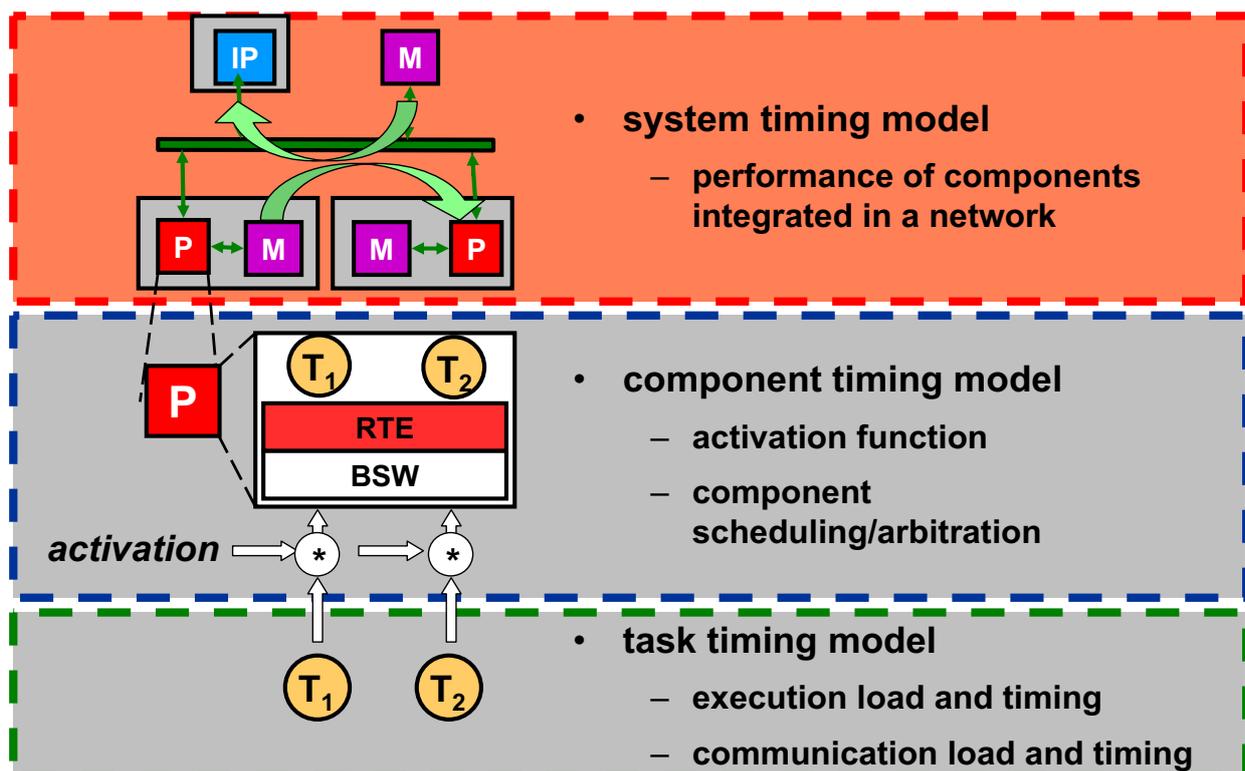
## Delay and Backlog



# Overview

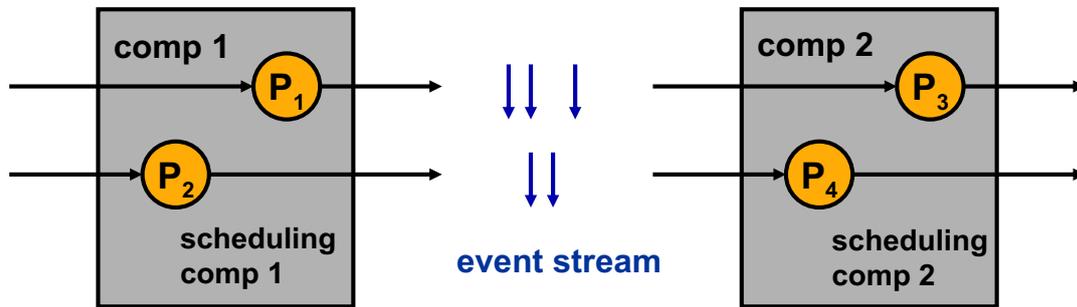
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## Timing Model Hierarchy – System Timing Model



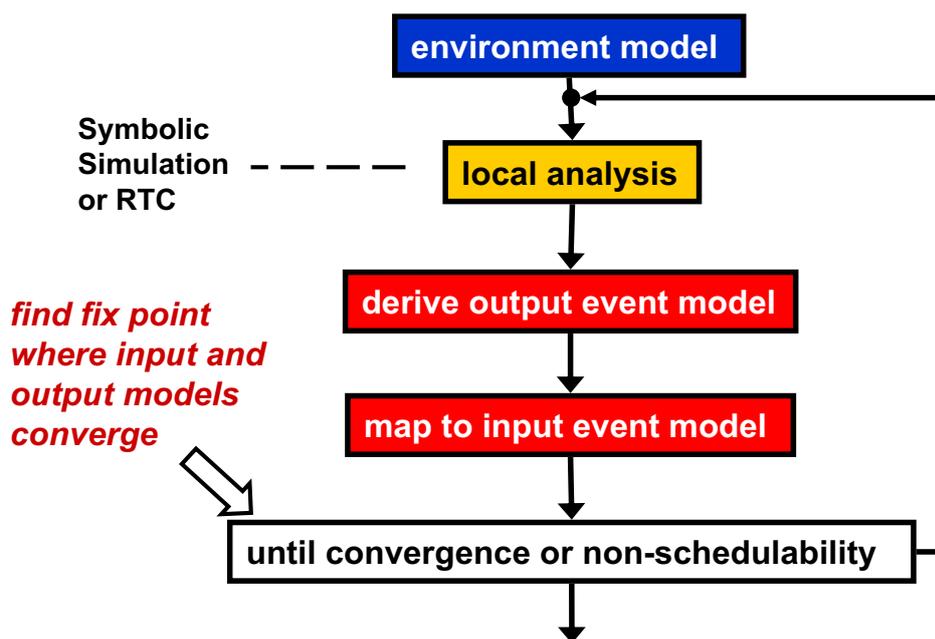
## System analysis using compositional approach

- independently scheduled subsystems are coupled by data flow



- ⇒ subsystems coupled by **streams of data**
- ⇒ interpreted as activating **events**
- ⇒ coupling corresponds to **event propagation**

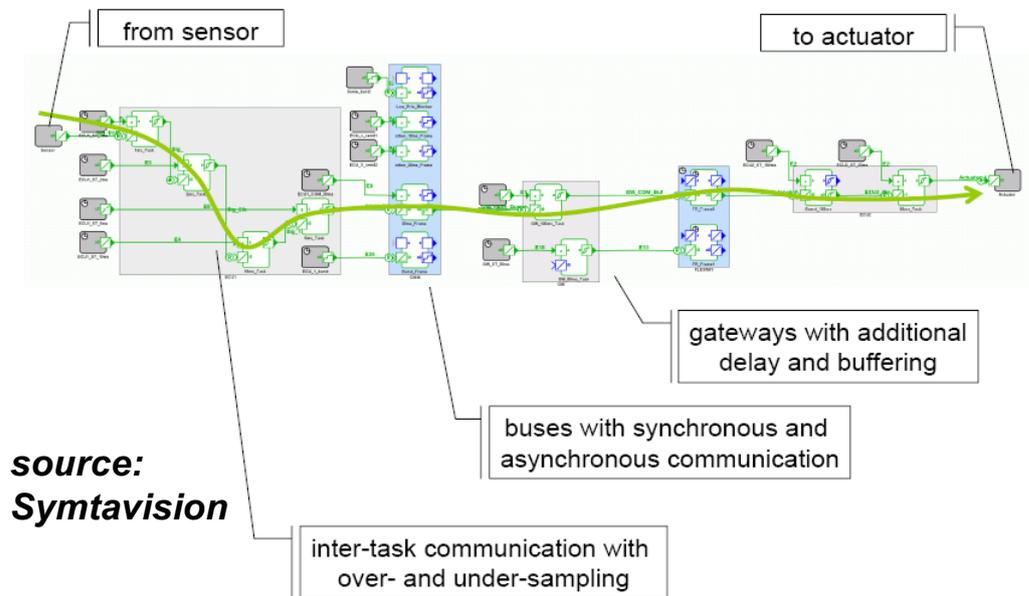
## Compositional analysis principle



## System-level Analysis Results

- end-to-end latencies
- buffer sizes
- system load
- ....

*example: complex end-to-end latency analysis w. SymTA/S*



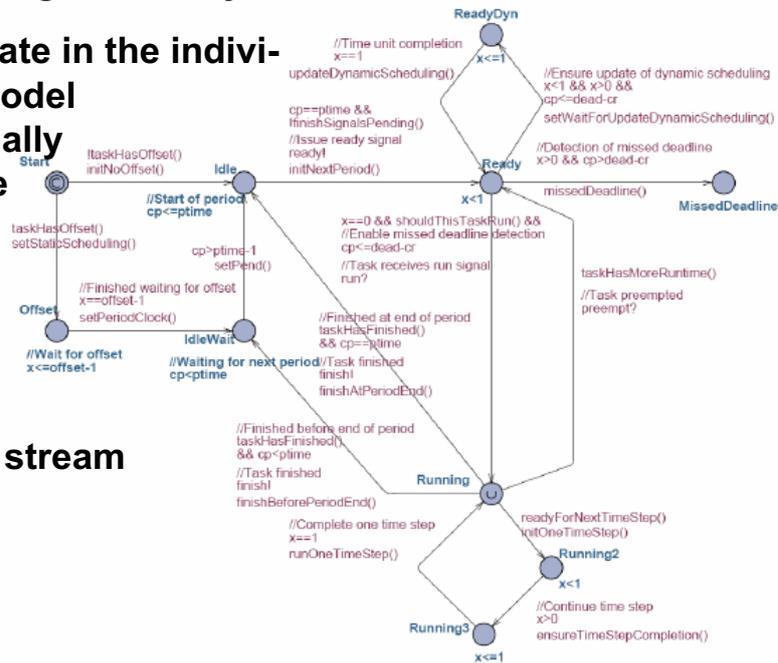
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## Compositional Analysis Properties

- compatible event stream models allow to couple any number of blocks for local analysis
  - scalable
- fixpoint iteration automatically adapts to platform topology
  - easy integration and extension
  - RTC and SymTA/S analysis blocks have been shown to easily work together [KHT07]
- very short analysis time (few seconds) opens new opportunities in design space and robustness optimization

## Further Performance Models 1/2

- timed automata have been used to explicitly model the task scheduling algorithm and OS interactions and then apply model checking to identify deadline violations
- can be more accurate in the individual component model but is computationally far more expensive
- work e.g. Madsen or Johnson
- can potentially be linked via common event stream models



## Further Performance Models 2/2

- will be discussed in separate tasks of this tutorial

## Overview

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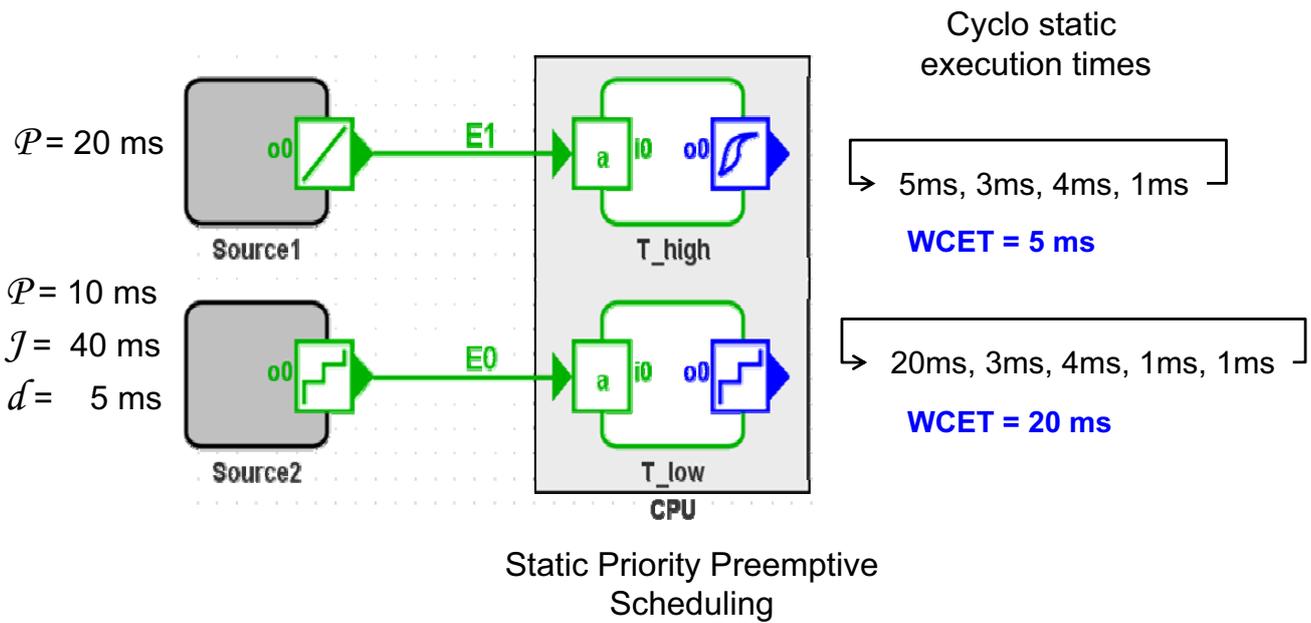
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## Enhancements to the Basic Analysis

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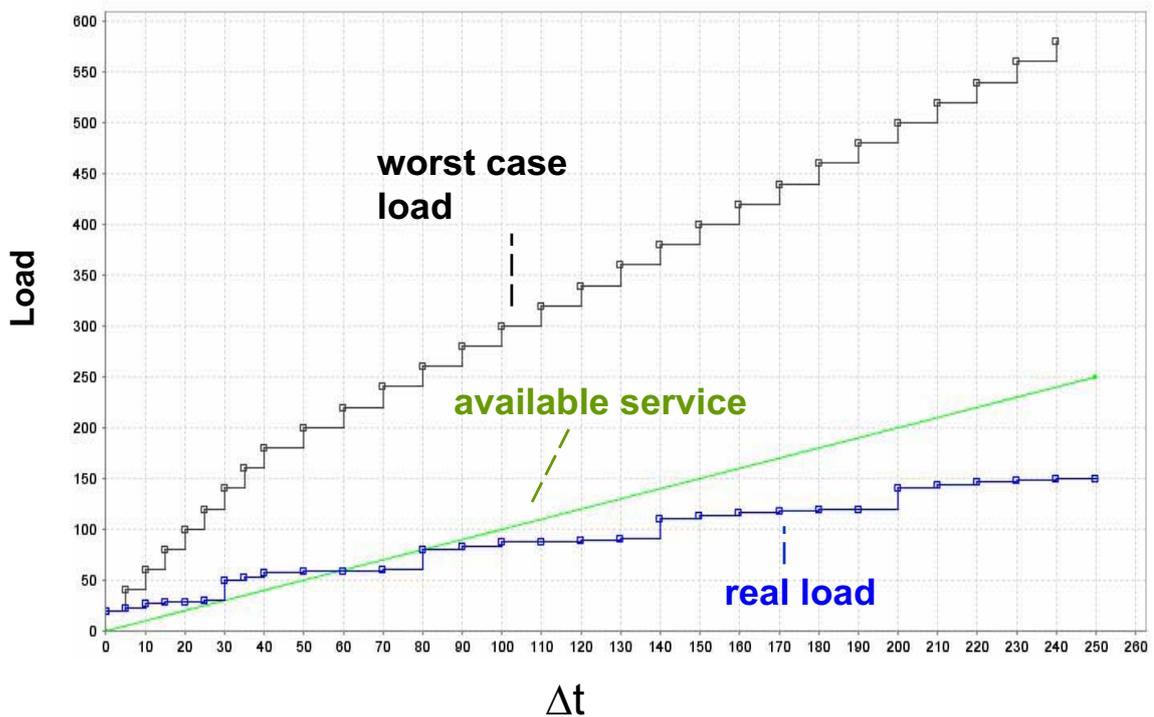
- **load modeling for varying execution times**
- shared memory modeling on MpSoC
- robustness optimization

# Load Modeling for Varying Execution Times

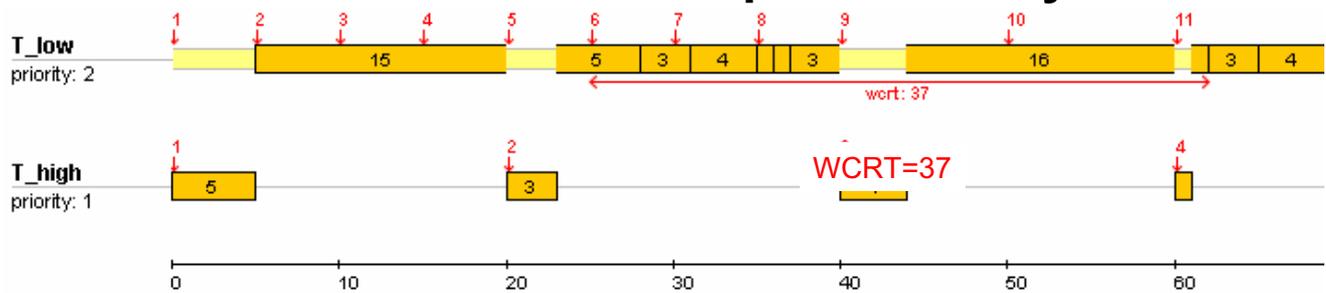


- Simple Example – cyclo-static system

## Load for Interval $\Delta t$ : $T_{low}$



# Real Load Used in Improved Analysis

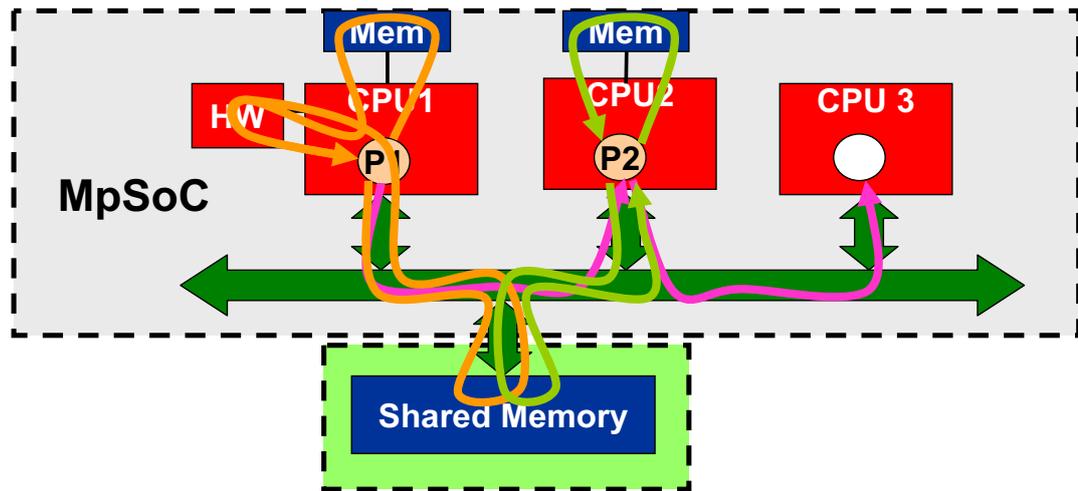


- improved analysis available for SymTA/S (see above) and MPA
- even more powerful: **Scenario Analysis**
  - identify different sets of tasks or deviating core execution times of tasks for different application contexts → scenarios
  - example: different use of smart phone, car: acceleration/idle, ..
  - interesting is transition between scenarios possibly leading to overloads, lost data, ...
  - see literature

## Enhancements to the Basic Analysis

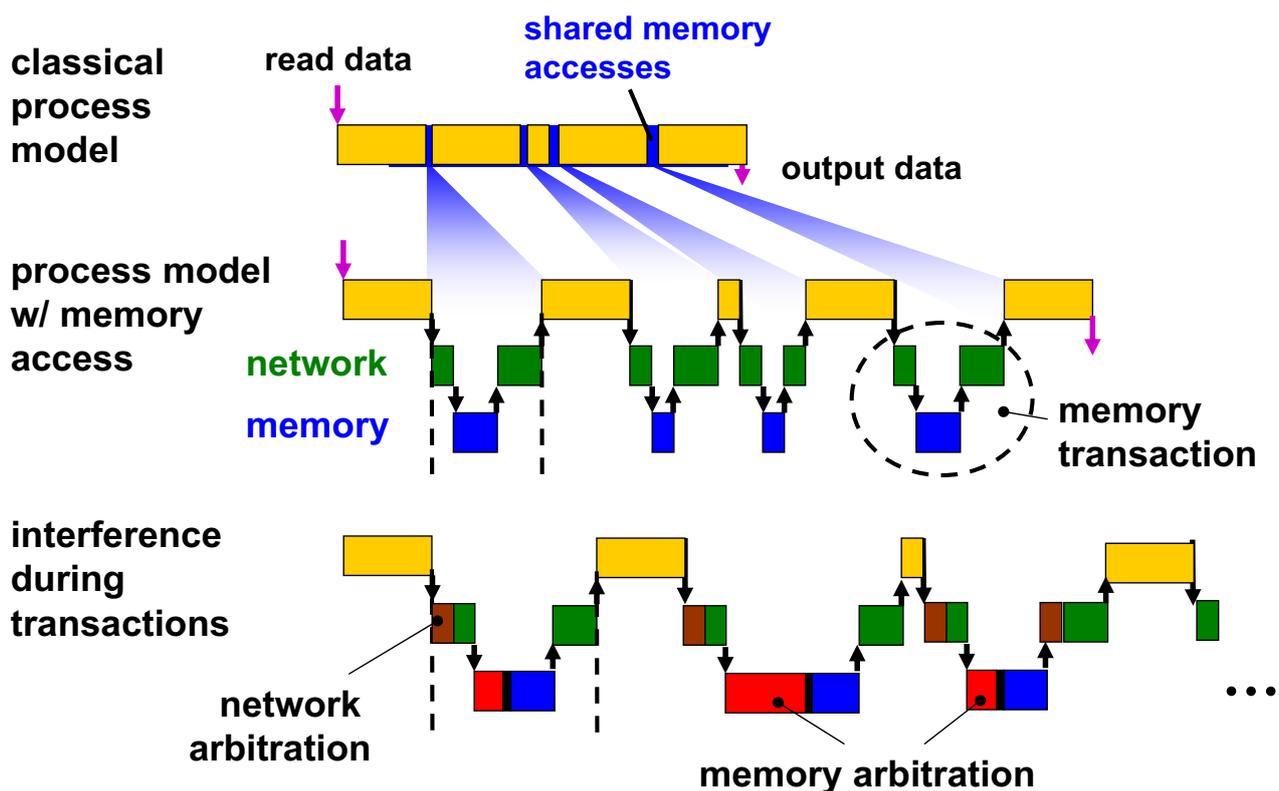
- load modeling for varying execution times
- **shared memory modeling on MpSoC**
- robustness optimization

# MpSoC with "Secondary" Traffic



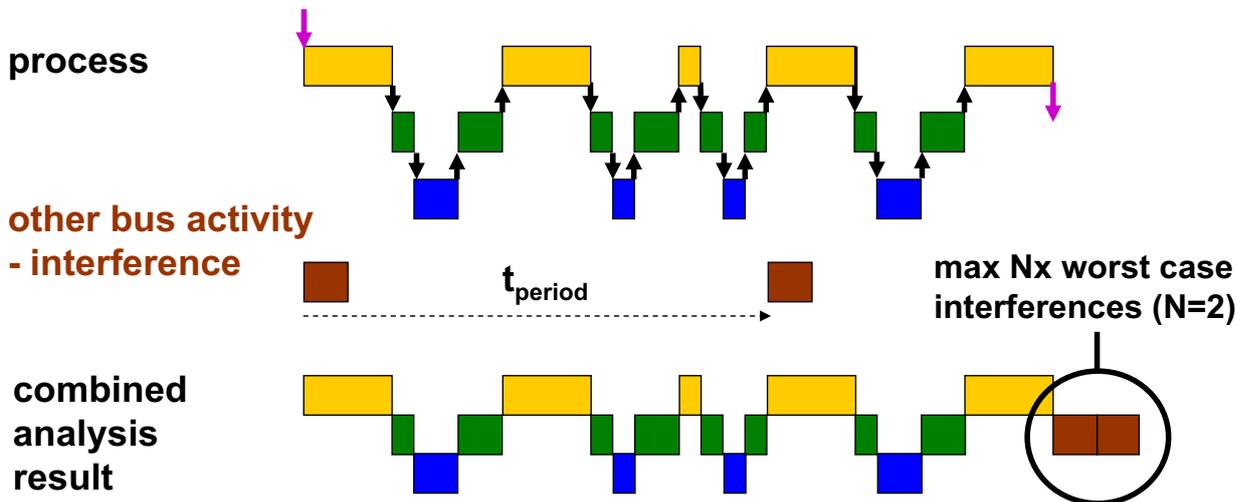
- use of shared memories or shared coprocessors
  - shared on-chip data and programs
  - larger off-chip memories
- data and program memory accesses on same network as task communication - more complex traffic

## MpSoC process execution



## Combined memory transaction modeling

- combined analysis of all process memory transactions
  - add all delays that can occur during all transactions of a process in the worst case
  - more realistic bus and memory timing

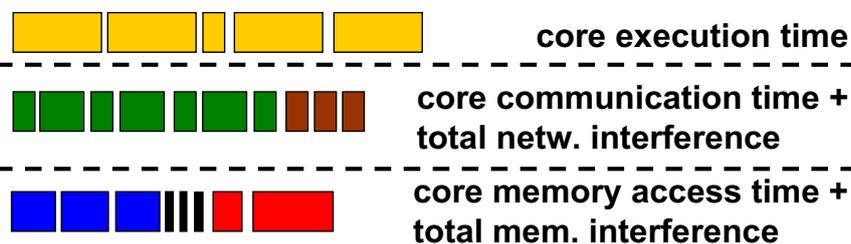


## Improved combination in transaction modeling

- complex and highly dynamic interactions if memory transactions of *multiple processors* interfere
  - simple combination not sufficient

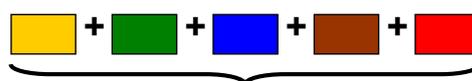
### Solution:

- derive **upper total interference bound** using formal analysis



- **superimpose** on each core

→ total execution time (conservative)



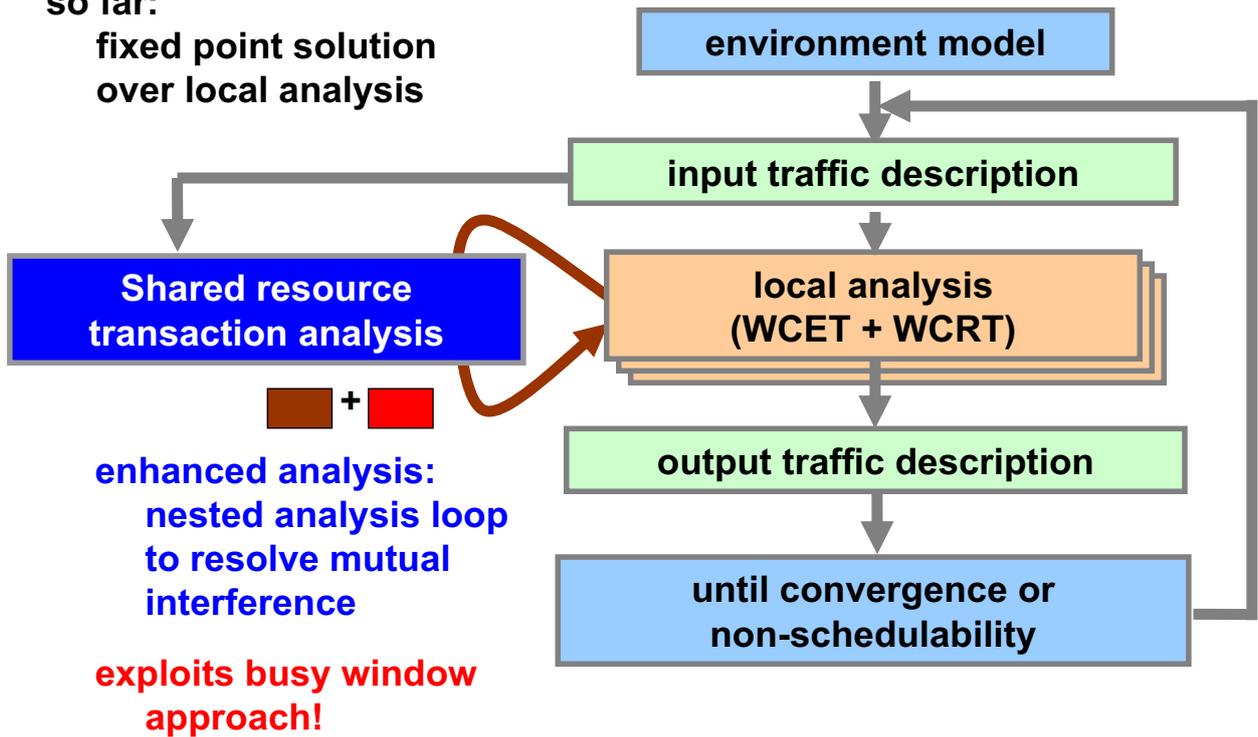
$\geq$  total worst case execution time

- couple single core analysis with iterative nested scheme
  - enhanced SymTA/S analysis

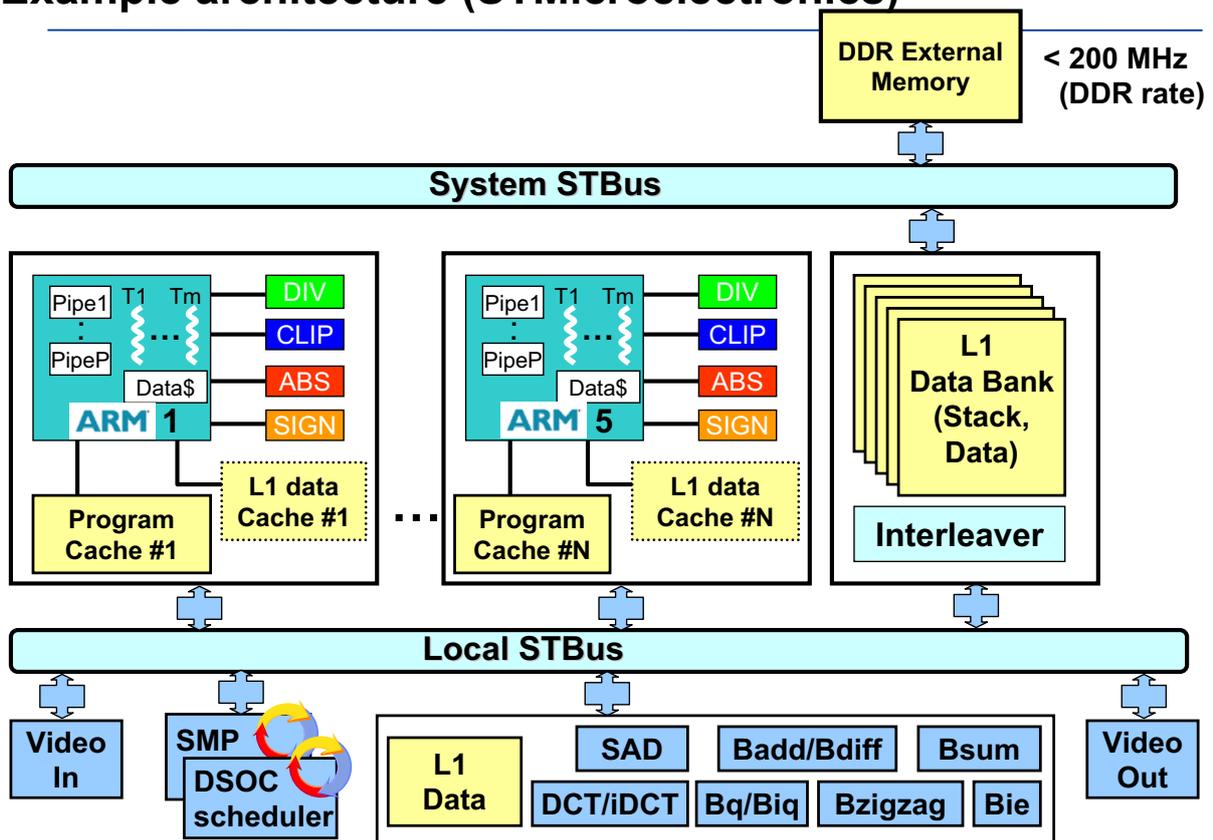
# Enhanced SymTA/S compositional analysis engine

so far:

fixed point solution  
over local analysis

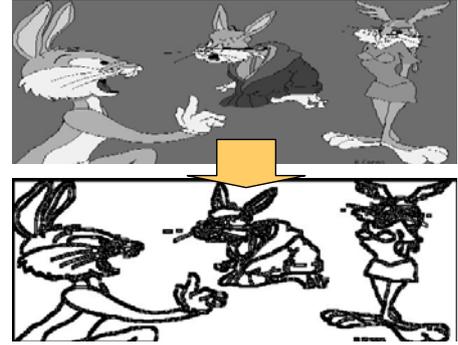


## Example architecture (STMicroelectronics)



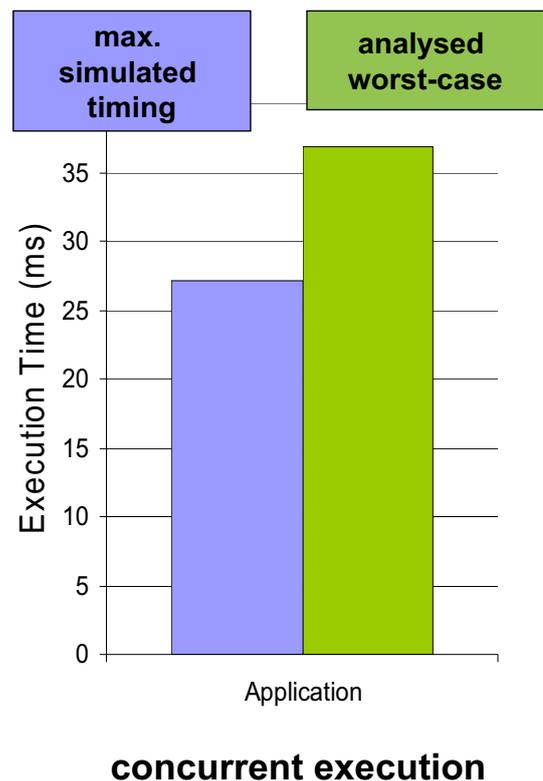
## Application: MPEG 4 contour detection

- contour detection algorithm from École Polytechnique de Montreal (Gabriela Nicolesu)
- 2 – 4 processor architecture
- 2 threads per processor
  - round-robin scheduling
- StepNP simulator available
- input data acquisition using simulation
  - simulation results of subtasks on single core

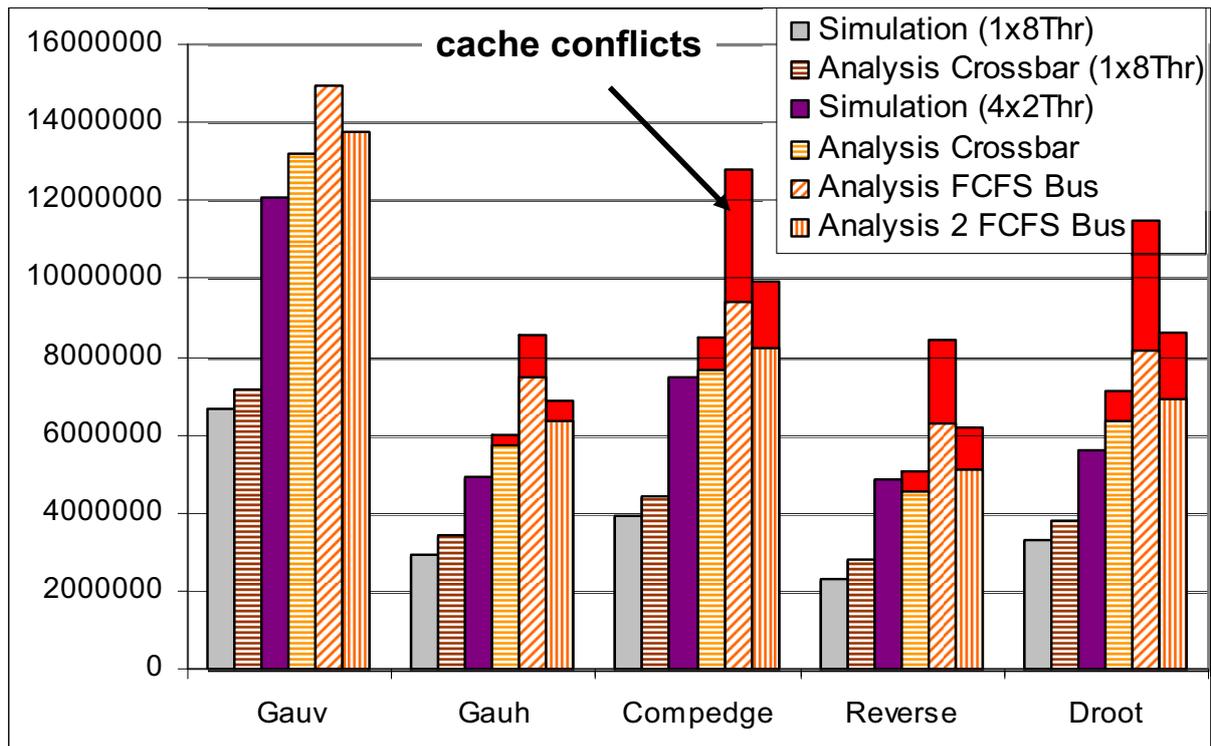


## System level analysis

- very fast analysis of worst case behavior considering
  - bus/network congestion (if any)
  - memory congestion
  - multithreading
  - coprocessors ...
- 35% larger analyzed timing than maximum simulation result
  - simulation uses simplified crossbar communication model
- planned for investigation of processor sharing, degree of parallelism / pipelining, ...



## Detailed Analysis



## Enhancements to the Basic Analysis

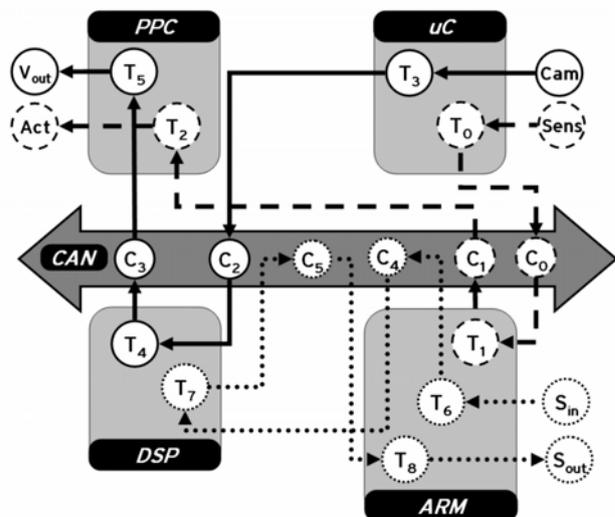
- load modeling for varying execution times
- shared memory modeling on MpSoC
- **robustness optimization**

# Robustness Optimization

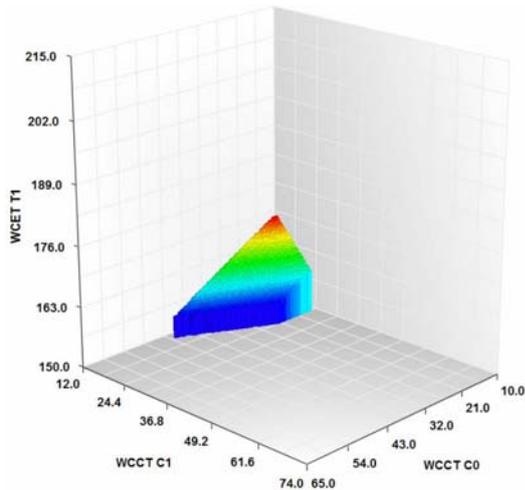
- goal: improve slack in architecture, such that a single or a combination of load data can change later on without affecting end-to-end deadlines and other constraints
- approach
  1. analyze remaining slack in architecture (1 or multidimensional)
    - uses binary search or evolutionary algorithms
  2. optimize system parameters to maximize slack
    - uses evolutionary algorithm
- search parameters and controlled by designer

## Example System

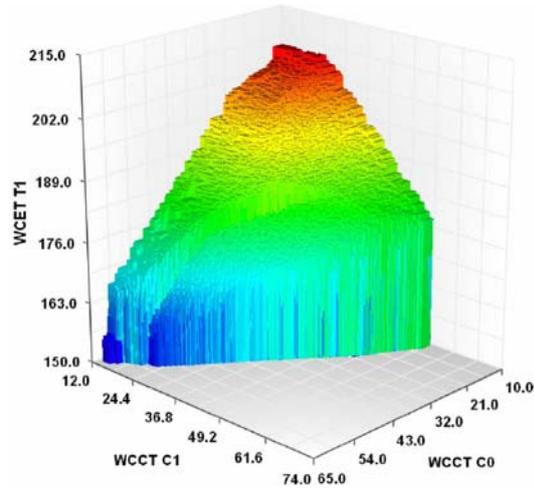
- Distributed embedded system
- 4 priority scheduled computational resources
- connected via CAN bus
- 3 sub-applications
  - Sens  $\rightarrow$  Act
  - $S_{in} \rightarrow S_{out}$
  - Cam  $\rightarrow V_{out}$



# Improving slack for T1 + C0 + C1 (1)



Org. Config.

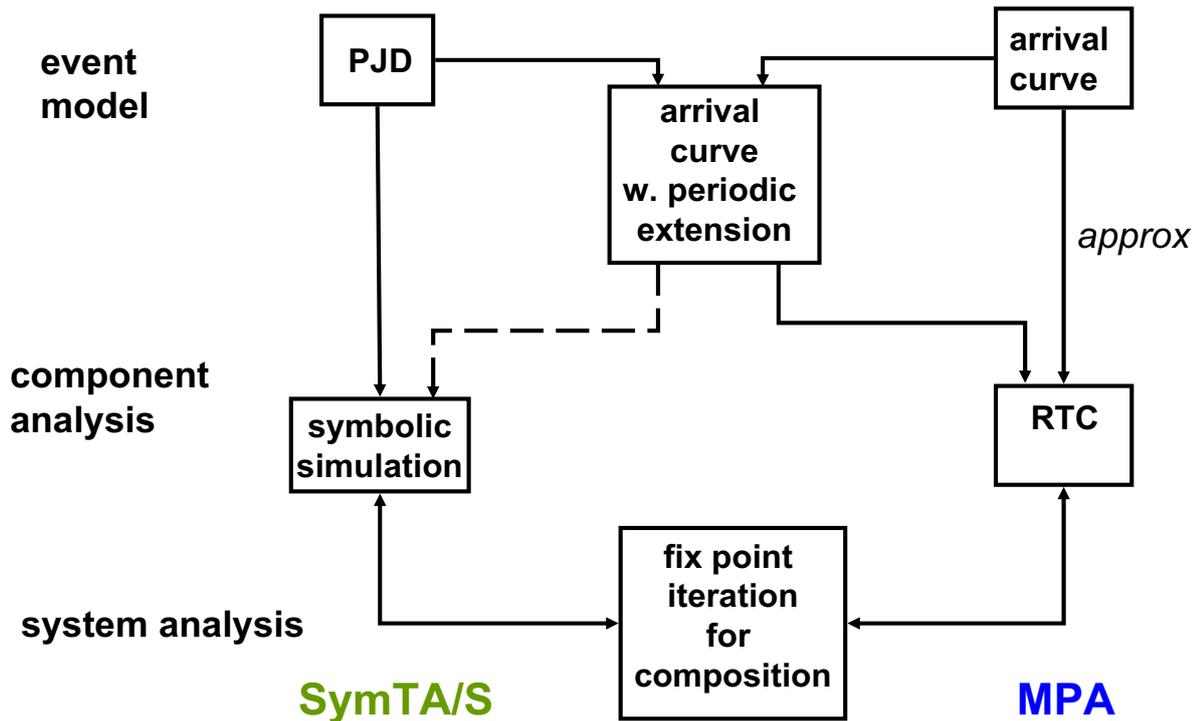


Optimized

## Overview

- applications for formal performance analysis methods
- formal performance modeling and analysis principles
- modeling activation and event streams
- component analysis
- system analysis
- enhancements to the basic analysis
- **summary and comparison**
- conclusion

# The Compositional Analysis „Landscape“



## Summary and Comparison

- the core difference between MPA and SymTA/S is the component analysis engine and not so much the event model (any more)
- RTC focuses on a closed notation of event and service model with a closed and intuitive formalism as a result
  - hierarchy is easier modeled in this formalism
  - very good results are achieved for the covered design space
- SymTA/S uses a generalisation of the busy window approach by Lehoczky/Tindell that develops the task sequence over a busy window
  - very versatile approach that covers complex features such as release offsets, mutual dependencies (round robin), context switching with blocking (non-preemptive) and „secondary“ memory access models
  - very good results shown for a wide range of industrial systems

## Conclusion

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- several performance analysis and optimization approaches have been proposed for heterogeneous embedded multiprocessor systems which have brought the technology far beyond the stage of toy examples
- the cost of a predictable design has been reduced by higher modeling and analysis precision
- applications range from early design stages when no executable code is available to verification of design integration
- the technology is applicable both to large scale distributed systems and for MpSoC

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# Formal Methods in System and MpSoC Performance Analysis and Optimisation



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Syntavision GmbH

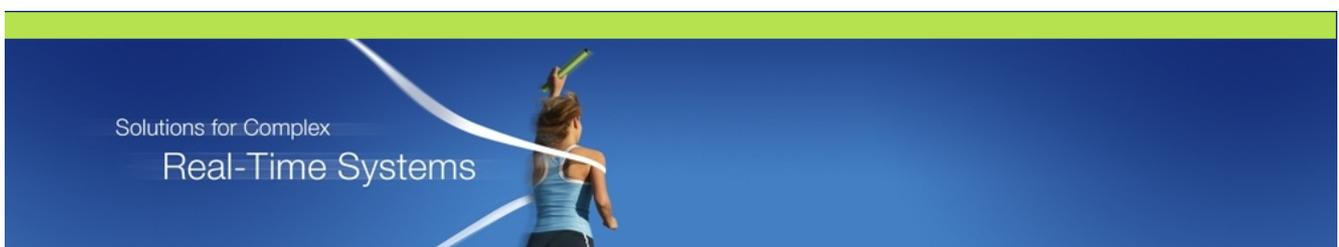


Tutorial, DATE 08 Conference  
March 10, 2008



## Performance Analysis and Optimisation – industrial applications in automotive design

Tutorial, DATE 08 Conference  
March 10, 2008



# Integration Challenges: 5 buses, 55 ECUs, hundreds of messages, thousands of functions

## CAN-B

- 1 Kombiinstrument (KI)
- 2 Elektronisches Zündschloss (EZS)
- 3 Mantelrohrmodul (MRRSM)
- 4 Zentrales Gateway (ZGW)
- 5 Audiotgateway (AGW)
- 6 Airbag ARMADA
- 7 SAM/SRB-Fahrer
- 8 SAM/SRB-Hinten
- 9 SAM/SRB-Befahrer
- 10 Klimatisierungsautomatik (KLA)
- 11 Sitzheizung/Sitzbelüftung/Lenkradheizung
- 12 Multifunktionssteuergerät (MSS)
- 13 Anhängersteuergerät (AAG)
- 14 Sitzverstellung mit Memory Fahrer (SSG-F)
- 15 Sitzverstellung mit Memory Beifahrer (SSG-BF)
- 16 Standheizung (STH)

- 17 Parktronicssystem (PTS)
- 18 Türsteuergerät vorne Fahrerseite (TSG-F)
- 19 Türsteuergerät vorne Beifahrerseite (TSG-BF)
- 20 Türsteuergerät hinten links (TSG-HL)
- 21 Türsteuergerät hinten rechts (TSG-HR)
- 22 Dachbodeninheit (DBE)
- 23 Unteres Bedien Feld (UBF)
- 24 Oberes Bedien Feld (OBF)
- 25 Reflektordruckkontrolle (TPM 1)
- 26 Rückwanduntersteuergerät (RWT)
- 27 Pumpe Fahrdynamischer Sitz (PFDS)
- 28 Fahrdynamischer Sitz links (FDS)
- 29 Fahrdynamischer Sitz rechts (FDS)
- 30 Automatischer Ladeboden (ALB)
- 31 Rückwandanschließung (RWTs)

## CAN-C

- 1 Kombiinstrument (KI)
- 2 Elektronisches Zündschloss (EZS)
- 3 Mantelrohrmodul (MRRSM)
- 4 Zentrales Gateway (ZGW)
- 5 Motorelektronik (ME)
- 6 Motorelektronik (CNG/CR)
- 7 Elektronische-Wählhebel-Modul (EWM)
- 8 Elektronische-Getriebe-Steuerung (NAG-2)
- 9 Sensaktive Lüftung (SLF)
- 10 Diatone (DTR)
- 11 Reversibler Gurtschraffer vorne links
- 12 Reversibler Gurtschraffer vorne rechts
- 13 Hydraulikeinheit (ABR)
- 14 Hinterachsneueuregler (HNR)

## MOST-RING

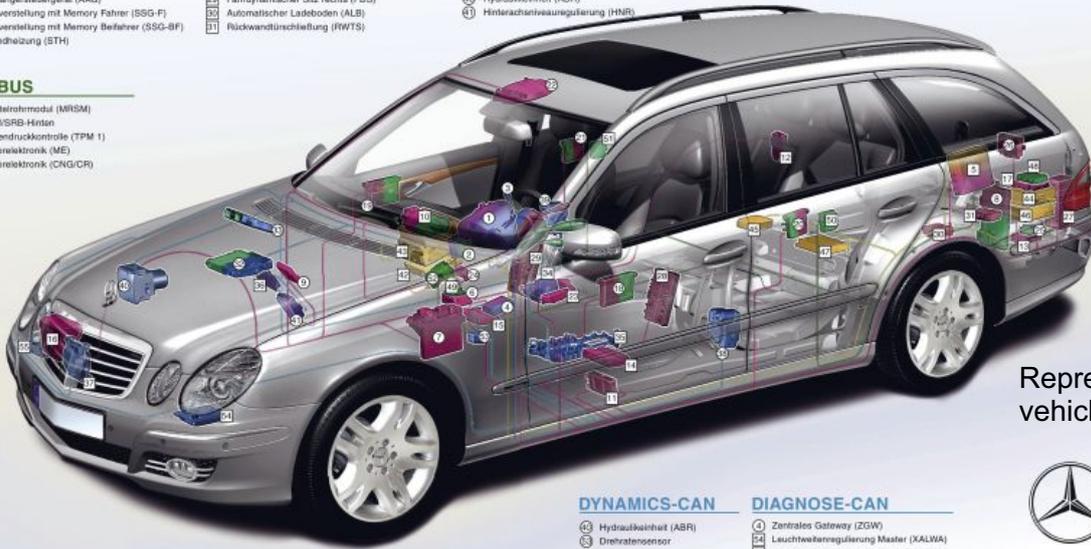
- 5 Audiotgateway (AGW)
- 10 CD-Wechsel (CD-C)
- 11 Bedienteil (COMMAND)
- 12 TV-Kombituner
- 13 Sprachbedienung (SBS)
- 14 Navigationsrechner
- 15 Universal Handy Interface (UHI)

## PRIVATE-BUS

- 2 Elektronisches Zündschloss (EZS)
- 10 Klimatisierungsautomatik (KLA)
- 18 Türsteuergerät vorne Fahrerseite (TSG-F)
- 19 Türsteuergerät vorne Beifahrerseite (TSG-BF)
- 20 Türsteuergerät hinten links (TSG-HL)
- 21 Türsteuergerät hinten rechts (TSG-HR)
- 40 Keyless Go Heckmodul
- 41 Keyless Go KG Innenraum Modul
- 42 Keyless Go KG Modul hinten links
- 43 Keyless Go KG Modul hinten rechts
- 44 Elektrische Lenkungsverriegelung (ELV)

## LIN-BUS

- 1 Mantelrohrmodul (MRRSM)
- 2 SAM/SRB-Hinten
- 25 Reflektordruckkontrolle (TPM 1)
- 5 Motorelektronik (ME)
- 6 Motorelektronik (CNG/CR)



Representative vehicle example



Mercedes-Benz

## DYNAMICS-CAN

- 13 Hydraulikeinheit (ABR)
- 14 Drehratensensor

## DIAGNOSE-CAN

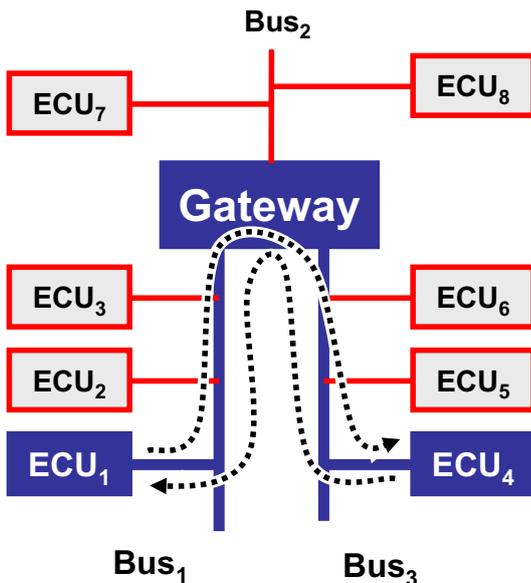
- 4 Zentrales Gateway (ZGW)
- 14 Leuchtwertenregler Master (XALWA)
- 15 Leuchtwertenregler Slave (XALWA)

Σ aller Steuergeräte: 55



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## Typical Automotive Architecture Today



Bus protocols

- CAN
- FlexRay
- Lin
- MOST
- Proprietary

ECU (electronic control unit)

- Single-Core CPU (but moving to dual-core)
- OSEK RTOS

Local + end-to-end timing / performance are important



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## Many functional problems are in fact *timing* problems

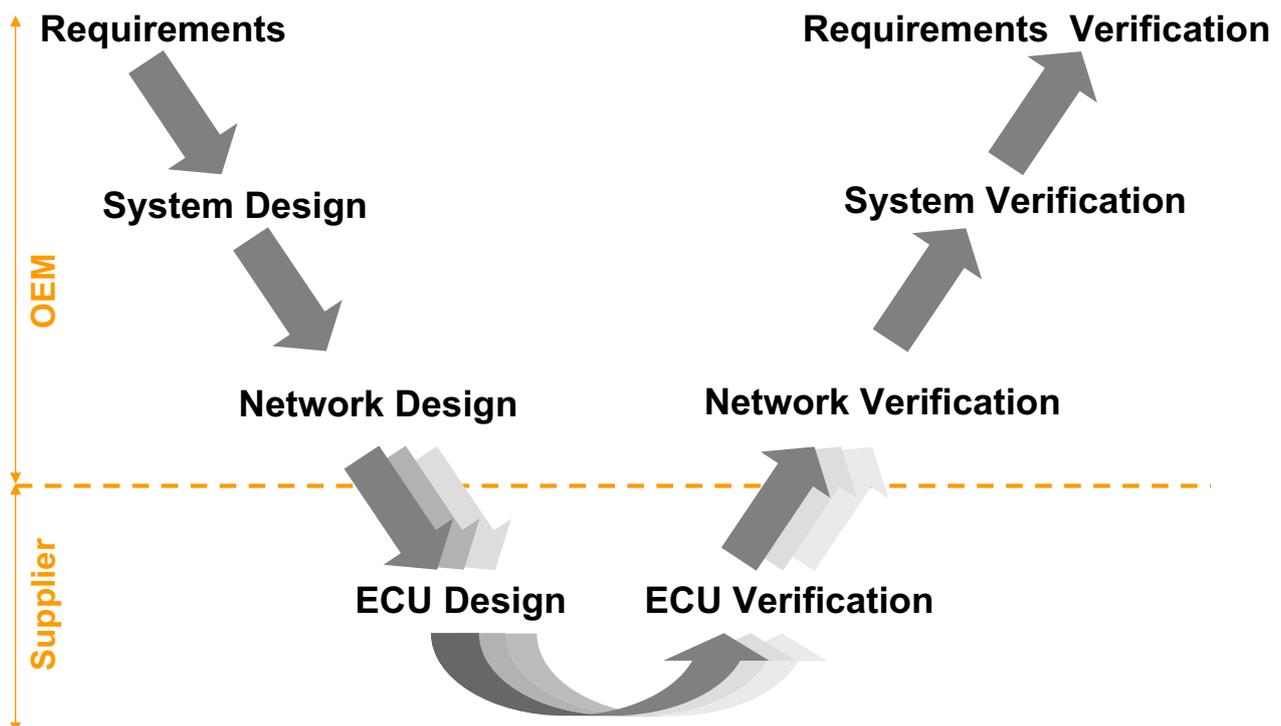
- ❑ ECUs (temporarily) overloaded
  - ❑ tasks not always schedulable
  - ❑ deadlines are missed
  
  - ❑ network (temporarily) overloaded
  - ❑ messages arrive "too late" or with "too large" jitter
  - ❑ messages are lost (buffer overflow)
  
  - ❑ end-to-end deadlines of car function are missed
  - ❑ stability of distributed control is compromised
- ➔ Carefully monitor performance and timing during design and integration



SYMTA VISION

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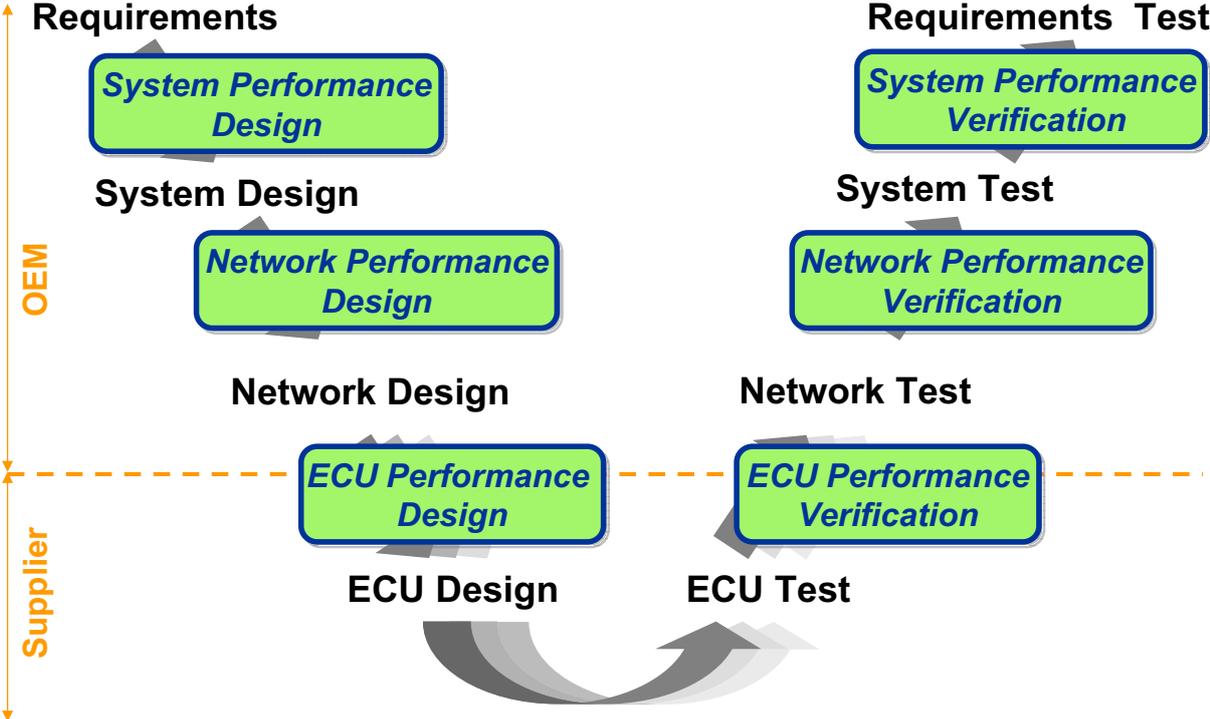
## Established Design Process



SYMTA VISION

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# Adding Performance Design and Verification

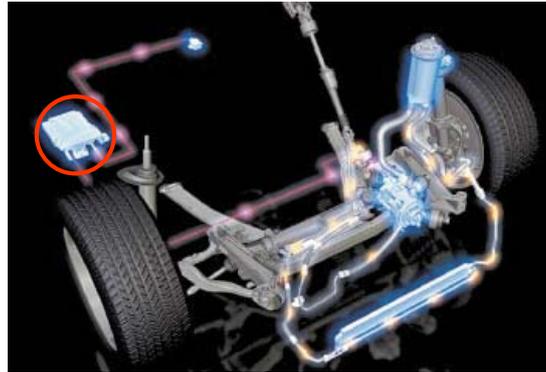
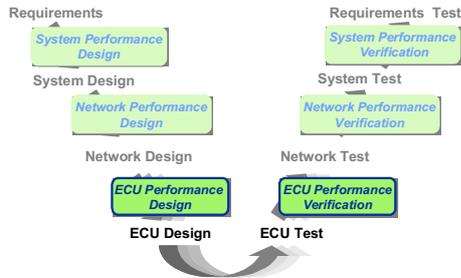


# Selected Automotive Use Cases

# Example 1: Safety-Critical ECU

## Chassis domain: Active Front Steering

- ❑ Verifying Performance and Timing for all critical cases
- ❑ Safeguarding against liability claims
- ❑ Optimizing ECU performance and cost (use of cheaper CPU)



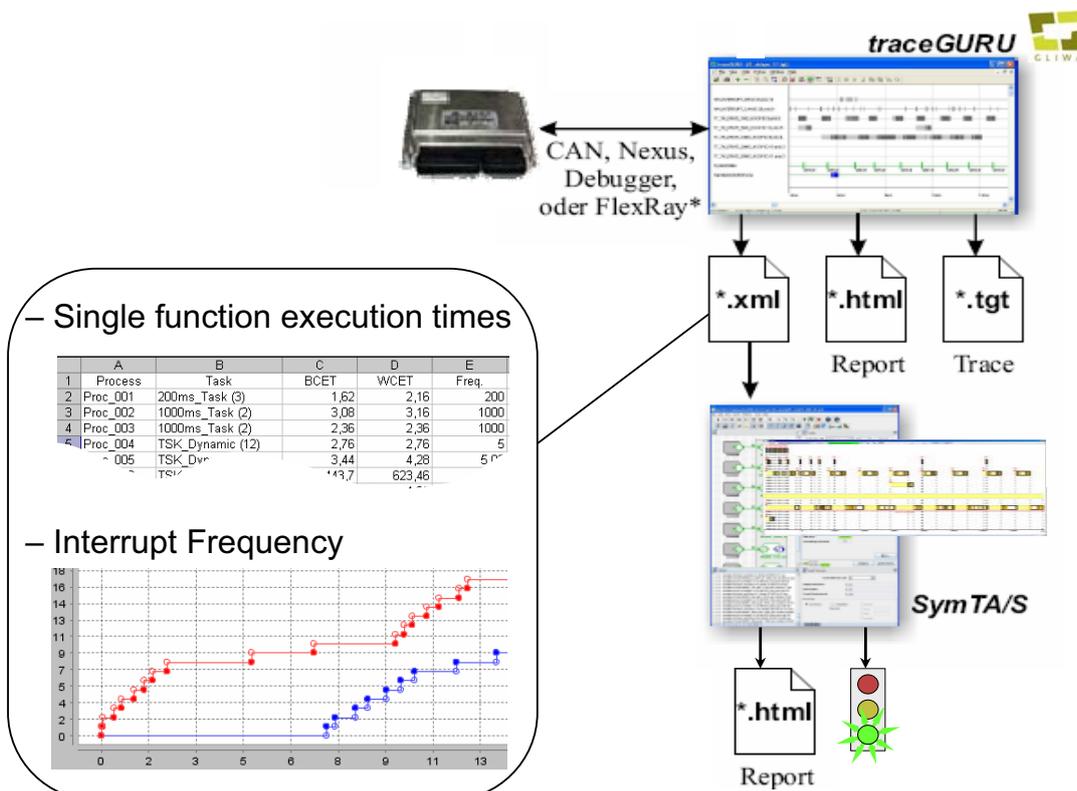
Source: BMW

Hans Sarnowski, responsible BMW Engineer: „You really get to know your system and can detect real-time errors in a fraction of time“



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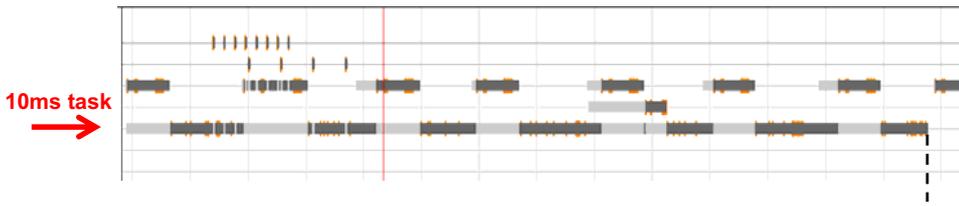
## Integration: Tracing + SymTA/S



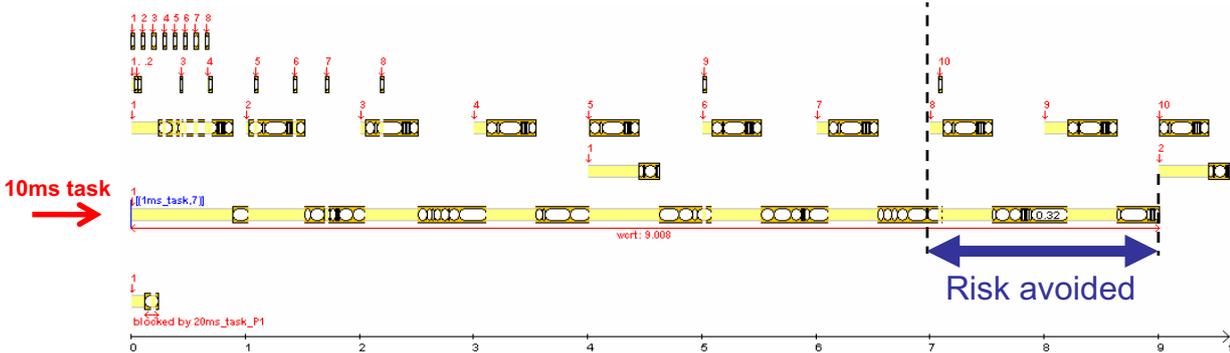
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# Focus: Tracing vs. SymTA/S Analysis

- ❑ Measured 10ms task: Response time **6,9ms**
  - ❑ 4 CAN, 8 SPI interrupts, 7 preemptions by 1ms task



- ❑ SymTA/S Analysis of 10ms task: Worst-case response time **9ms**
  - ❑ 10 CAN, 8 SPI interrupts, 9 preemptions by 1ms task, **blocking**

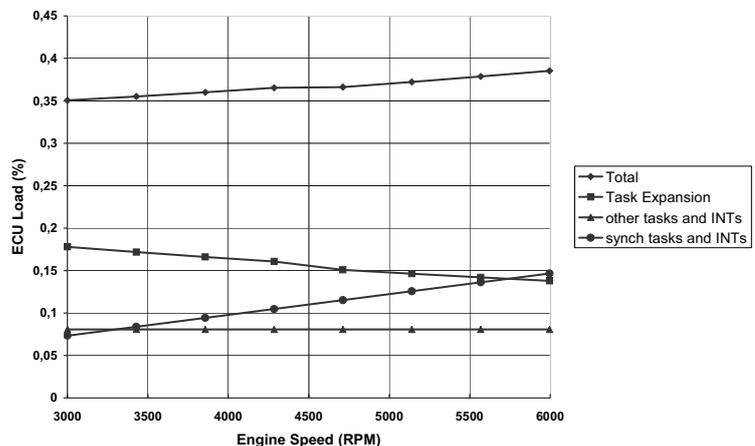
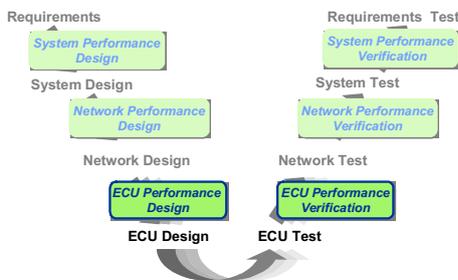


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## Example 2: High-Performance ECU

### Powertrain domain: Engine Control

- ❑ Verifying Performance and Timing for all engine speeds (RPM)
- ❑ Avoiding Deadline Overruns (would lead to ECU reset)
- ❑ Optimizing ECU performance and cost for different markets

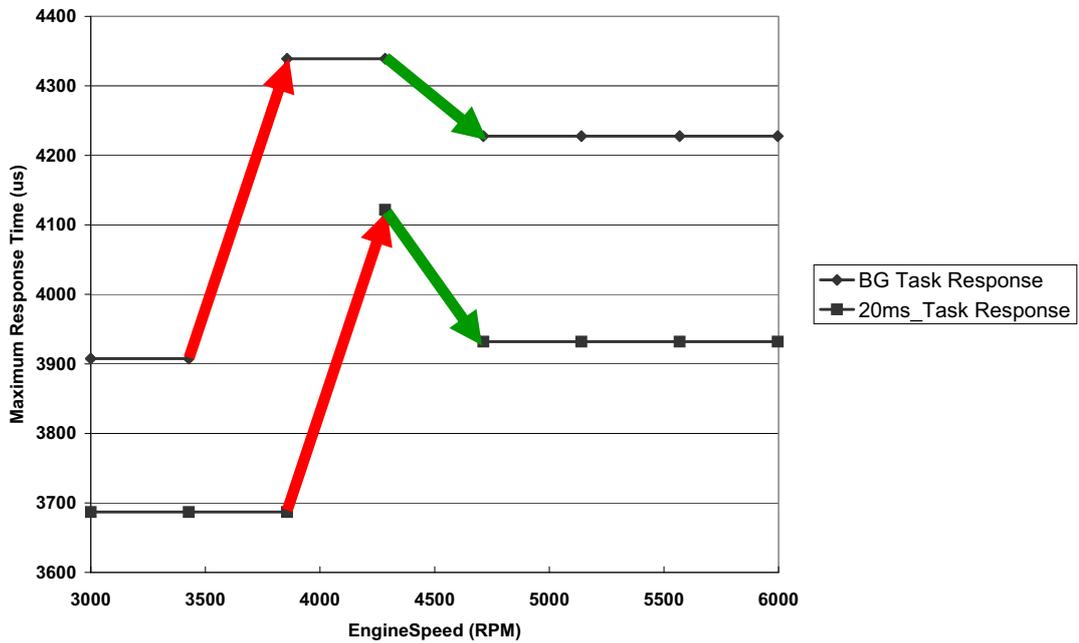


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# Detecting "Anomalies"

Additional preemption by RPM-synchronous tasks (increases task interference) 

Task cut-off (reduces core execution time) 

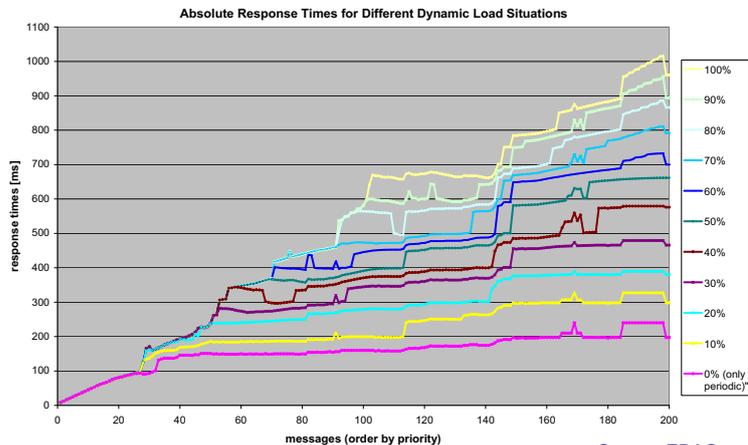
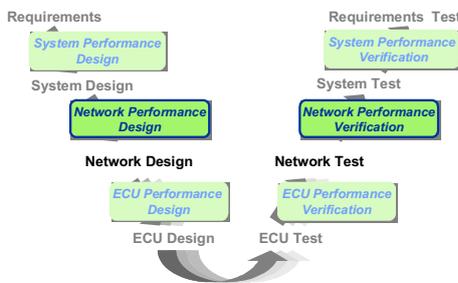


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## Example 3: Bus Configuration

### Bus / Network : CAN-Protocol

- Balancing Periodic load
- Calculating limits for dynamic load
- Configuring existing networks to handle additional traffic



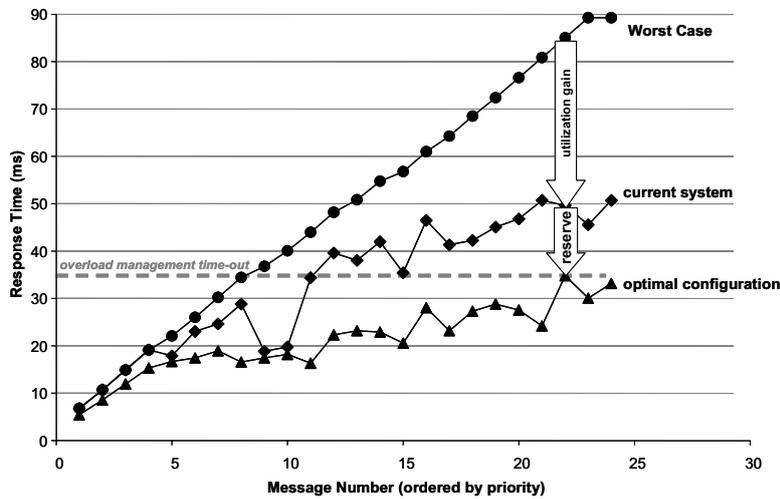
Source: EDAG



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# Focus: Reliable CAN Bus Configuration

- ❑ Optimized COM-Task Offsets
- ❑ Optionally: Optimized signal to frame mapping, CAN IDs
- ❑ Result: Reliable and optimized bus extension

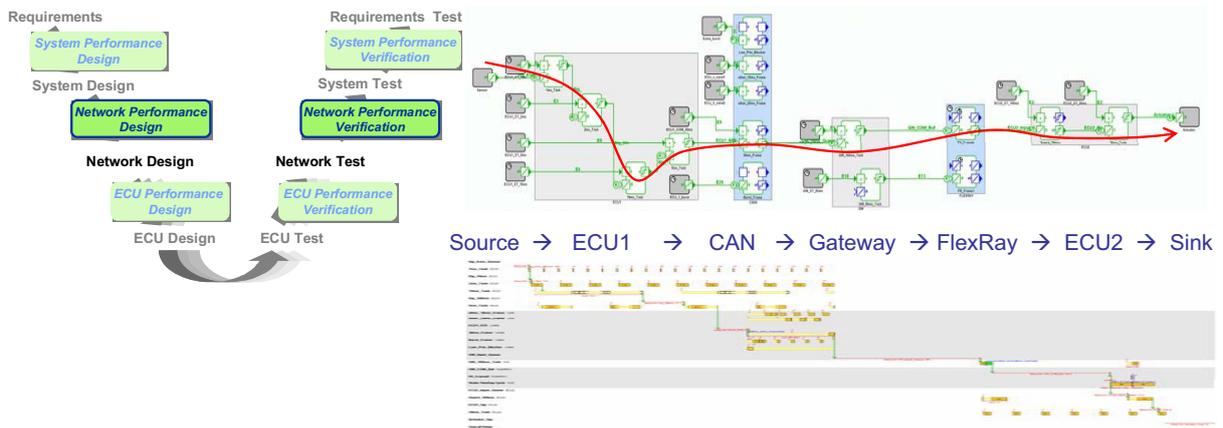


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## Example 4: Network Extension

### Bus / Network : Gated Network

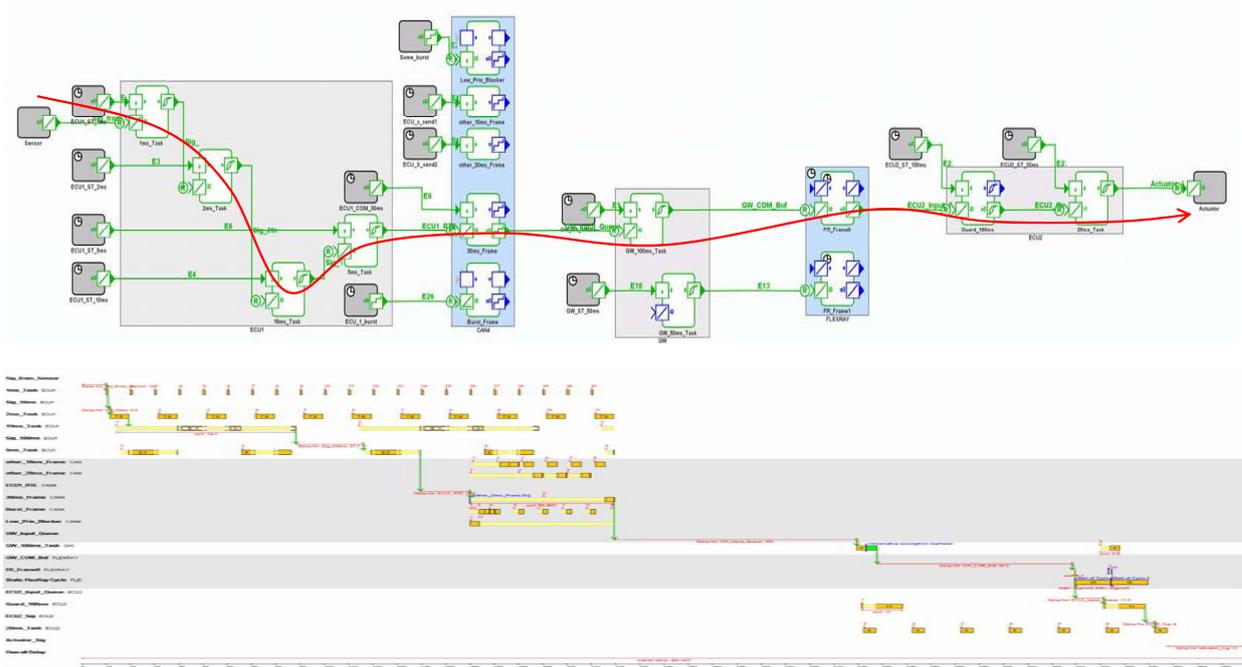
- ❑ Verifying end-to-end Timing
- ❑ Gateway dimensioning
- ❑ Optimizing synchronization to reduce end-to-end latency



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# Focus: End-to-end Timing Analysis

e.g.: Source → ECU1 → CAN → Gateway → FlexRay → ECU2 → Sink

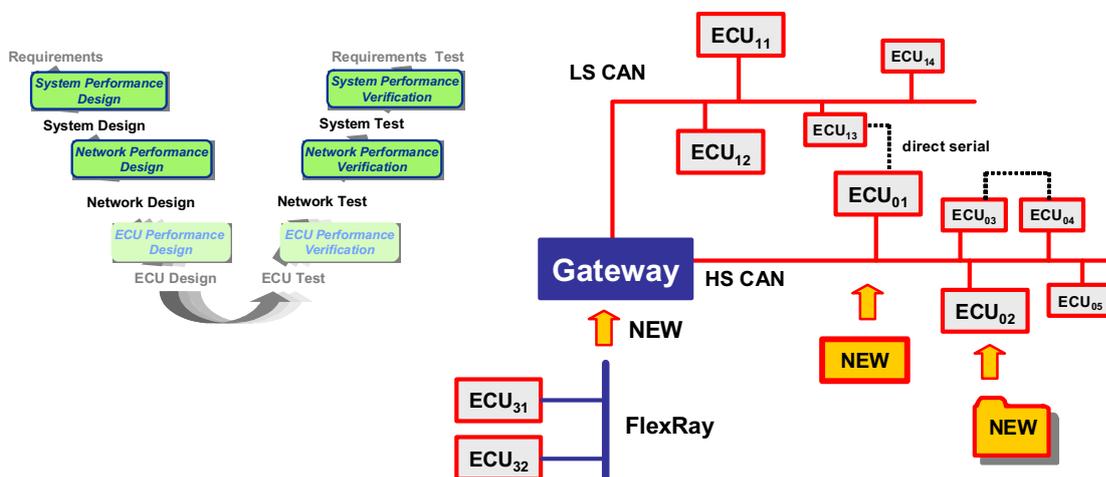


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## Example 5: System Extension

### Automotive System: Many ECUs and Protocols

- ❑ Complete System-level analysis of alternative configurations
- ❑ Migration to FlexRay and AUTOSAR
- ❑ Timing contracts between Integrator and Supplier

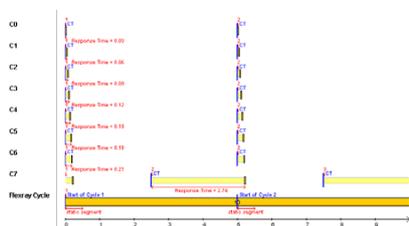


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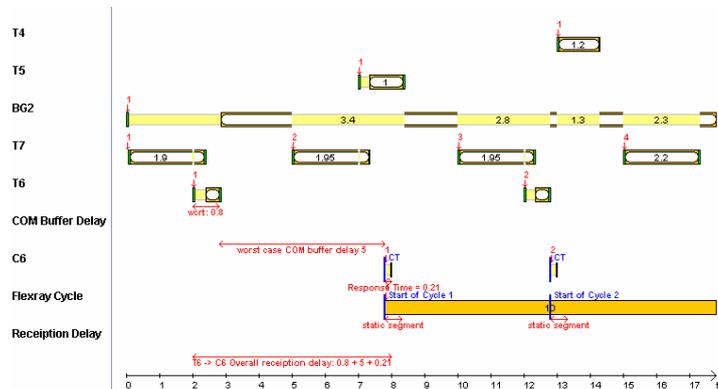
# Timing Challenges in FlexRay and AUTOSAR

## FlexRay : A challenge for ECU integration

- ❑ FlexRay does not solve timing problems in general
- ❑ A good FlexRay design requires timing effects to be understood
- ❑ Sync / async ECU integration can make a huge difference

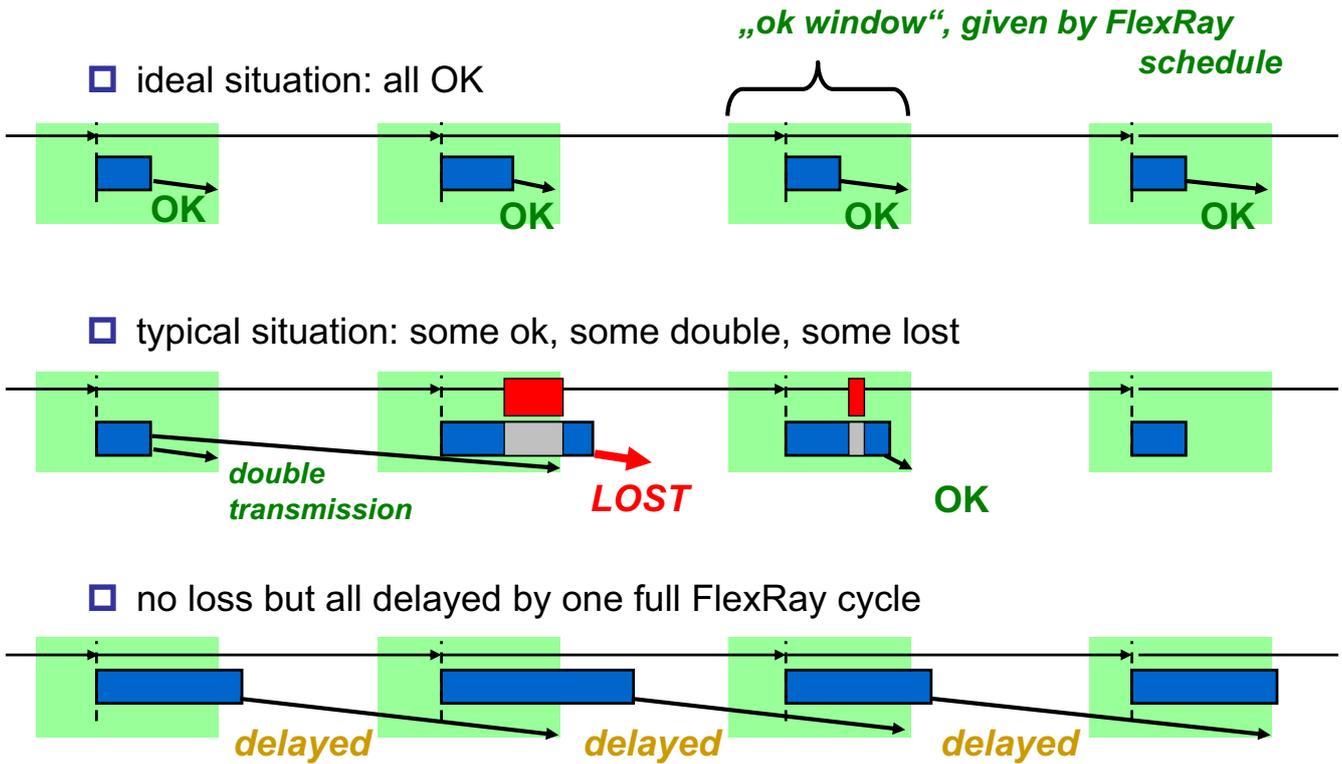


simple, static  
FlexRay schedule



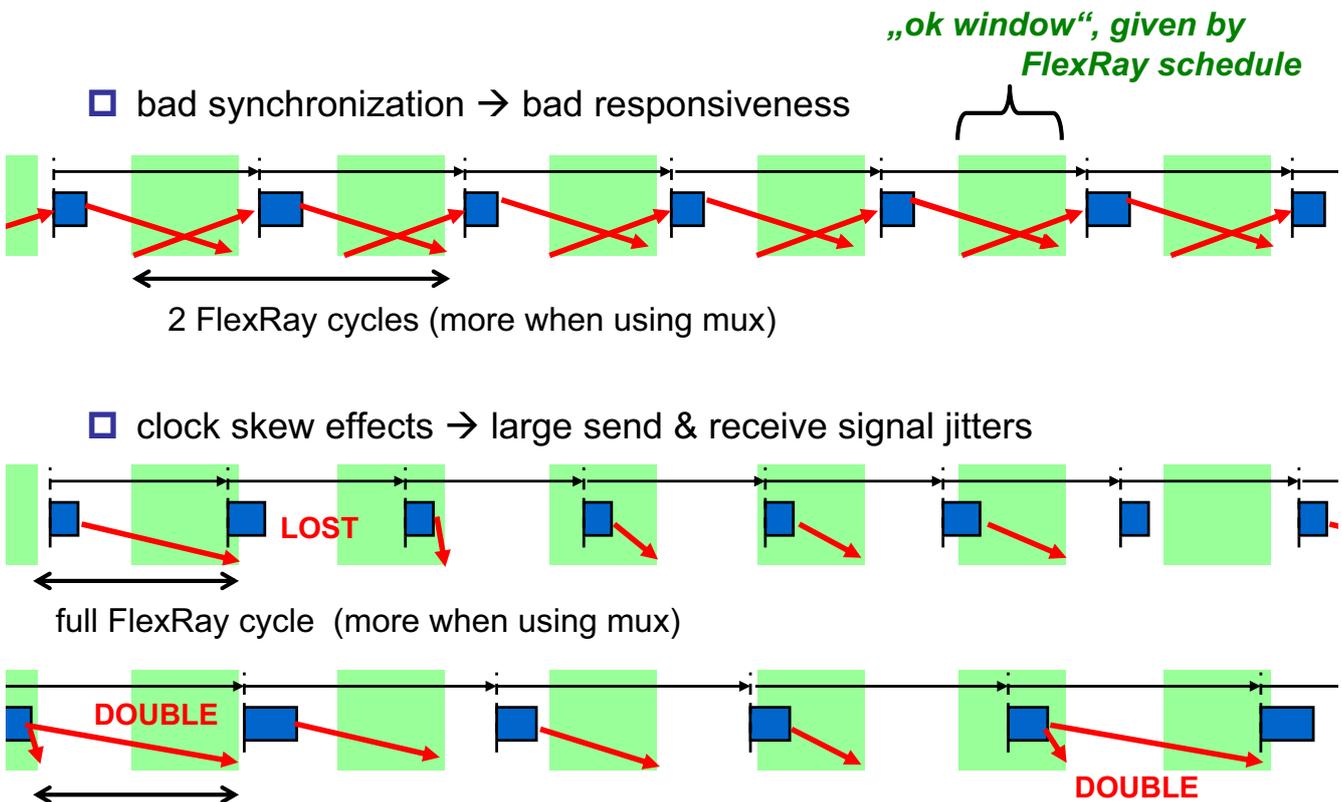
complex, dynamic  
system schedule

# OSEK (preemptive OS) synchronized with FlexRay

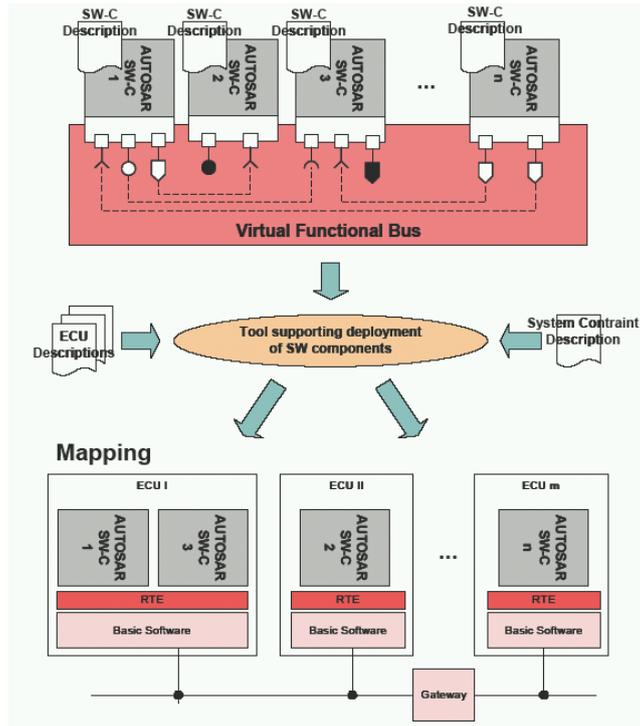


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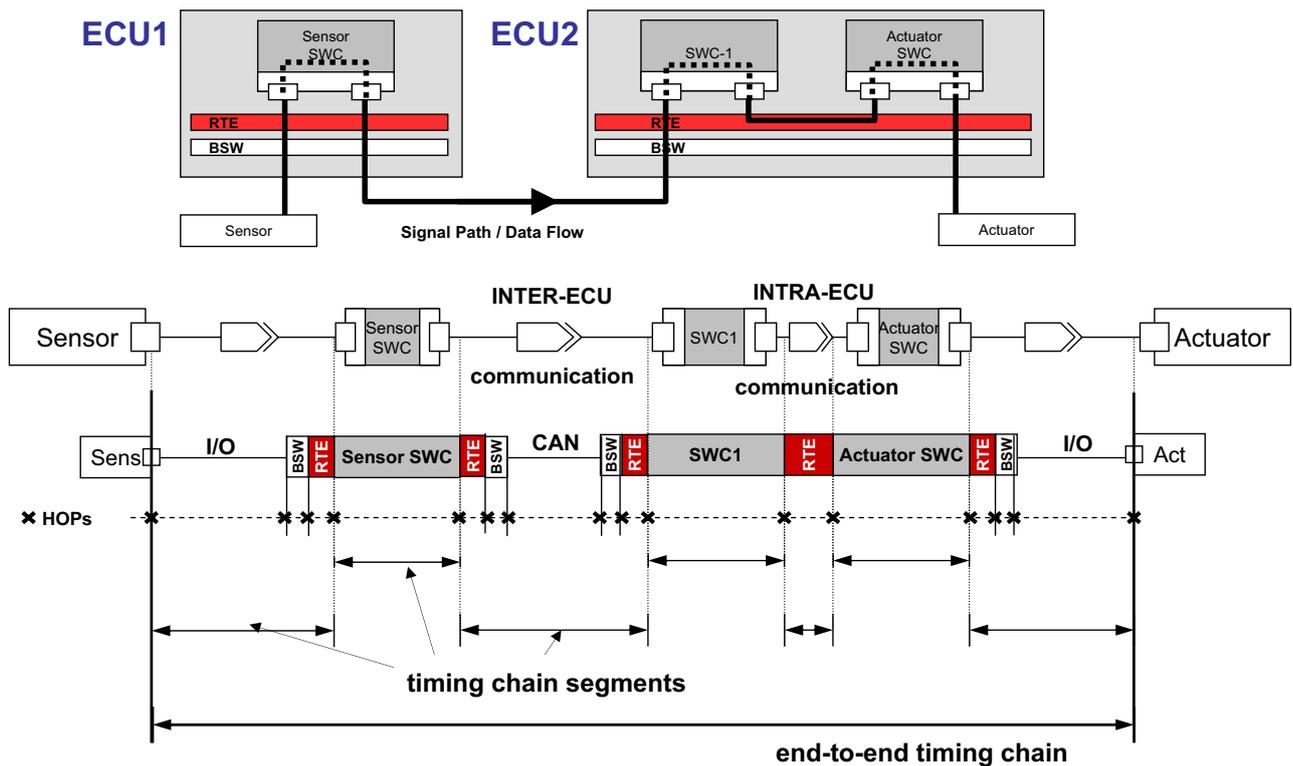
# OSEK ECU Asynchronous to FlexRay



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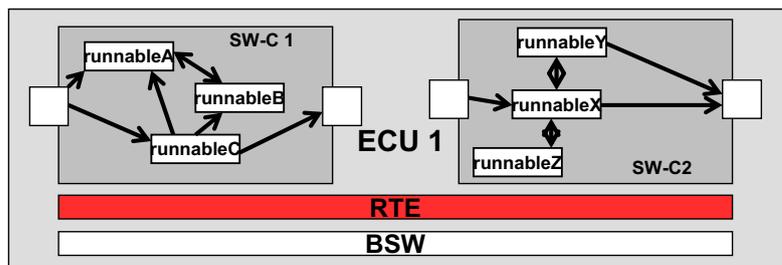


## AUTOSAR System Timing Aspects



# AUTOSAR SW-C vs. "Runnables" and Tasks

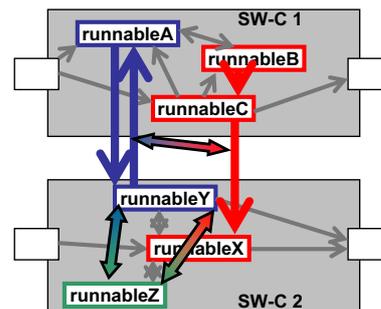
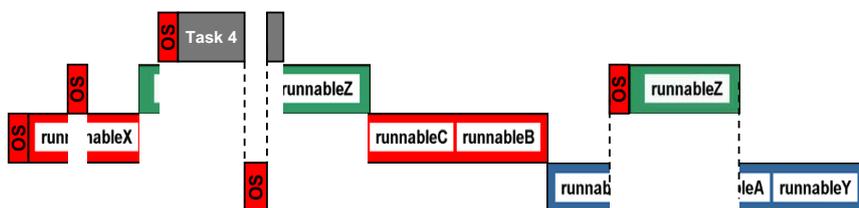
- SW architecture:  
2 SW components,  
6 runnables



- Implementation: 3 Tasks



- Schedule and timing dependencies



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## Ongoing work

- INTEREST – FlexRay Methodology  
<http://www.interest-strep.eu/index.html>



- TIMMO – AUTOSAR Methodology  
<https://www.timmo.org/>



INTEREST is a project funded by the Sixth European Framework Programme (FP6) - including the Information Society Technologies (IST) priority. The responsibility for the content rests with the authors.

TIMMO is a project in the framework of the ITEA 2, EUREKA cluster programme Σ1 3674. The work of the German partners is funded by the German Ministry for Education and Research (BMBF) under the funding IDs 01IS07002(B-I,K). The responsibility for the content rests with the authors.



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# Time is Money – Real-Time is a lot of Money

## System Optimization for BMW-Active Front-Steering



**Hans Sarnowski**  
EF-611

**DATE'08 Conference, 10. March 2008, Munich**

**BMW Group**



Time is Money – Real-  
Time is a lot of Money  
EF-611  
Hans Sarnowski  
DATE'08 Conference,  
10. March 2008,  
Munich  
Page 28

## **Steering with Pleasure.** **Agenda.**

- **Introduction**
- **System overview Active Front-Steering**
- **Application of timing tools for Active Front-Steering design**
- **Evaluation of results**

## Introduction. Design goals.

- Conventional steering systems have no further potential as the diversification/variation of hand moments (Servotronic) is largely exhausted.
- Driving performance is increasing continuously. A rigid steering system can hardly provide both stability and handling.
- Stability control through breaking of individual wheels is experienced as more and more uncomfortable.

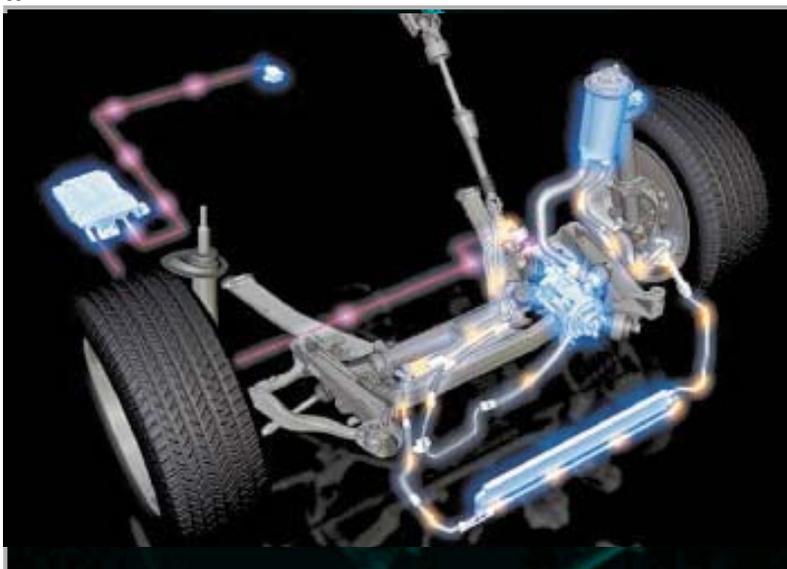


Superposition steering offers both the advantages of conventional steering systems and the functions of steer-by-wire-systems.



- Pure by-wire-systems are (still?) too complex, too costly and show a synthetic steering sensation. Their market acceptance is questionable.

## System Overview Components of Active Front-Steering



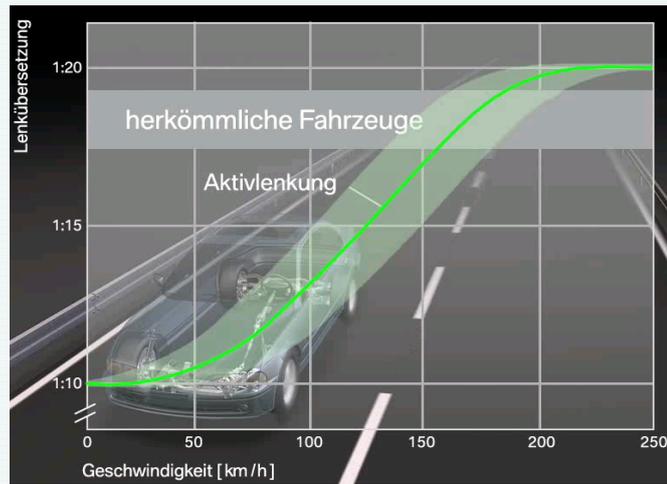
### Components of Active Front-Steering:

- Rack steering
- E-Motor
- Superposition gearbox
- Steering column
- Control unit
- Sensor cluster
- Power steering pump, oil tank
- Tubes, cooler

# Function Overview

## Steering Functions

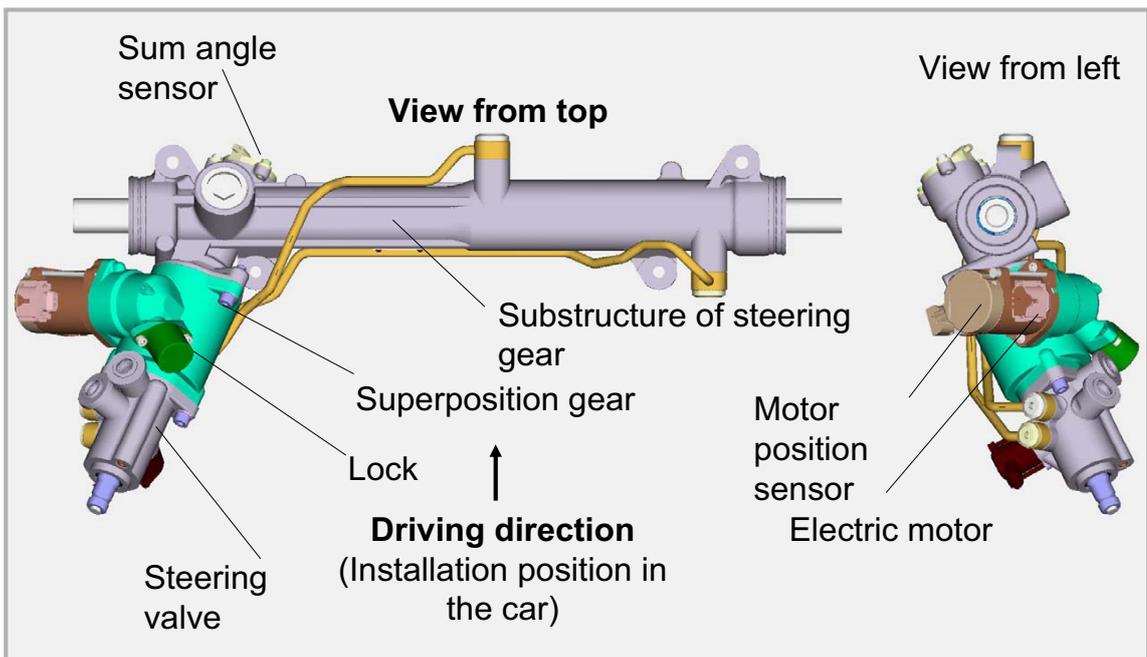
- The steering ratio depends on steering wheel angle and vehicle velocity
- Adjusting objective target-settings according to the driving dynamics of the vehicle
- Coupling with Servotronic (Steering transmission and the level of steering power are adjusted to each other)



Superposition steering offers both the advantages of conventional steering systems with the functions of steer-by-wire-systems.

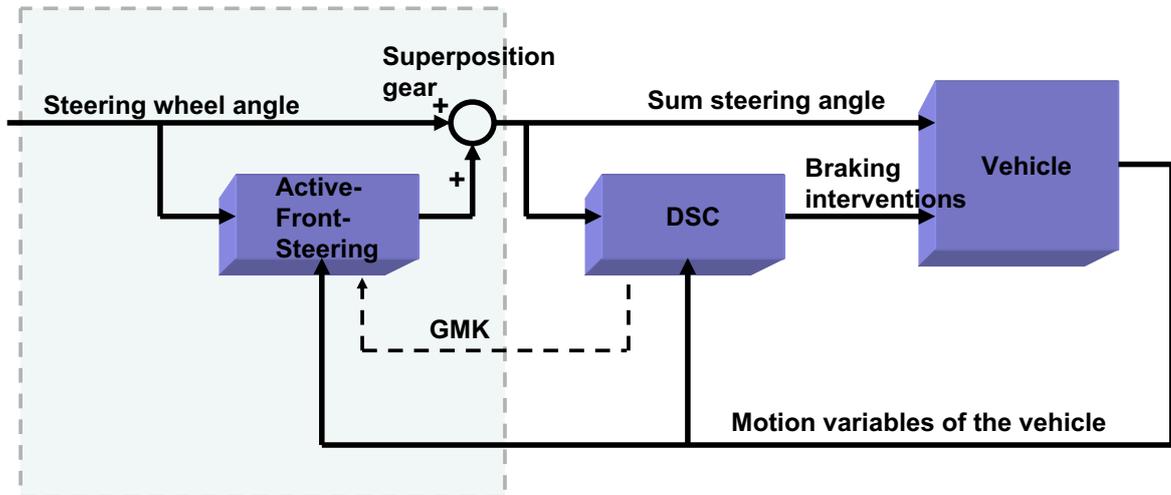
# Mechanics.

## Mechanical Design.



## Function Overview

### Integration of Active Front-Steering - DSC.



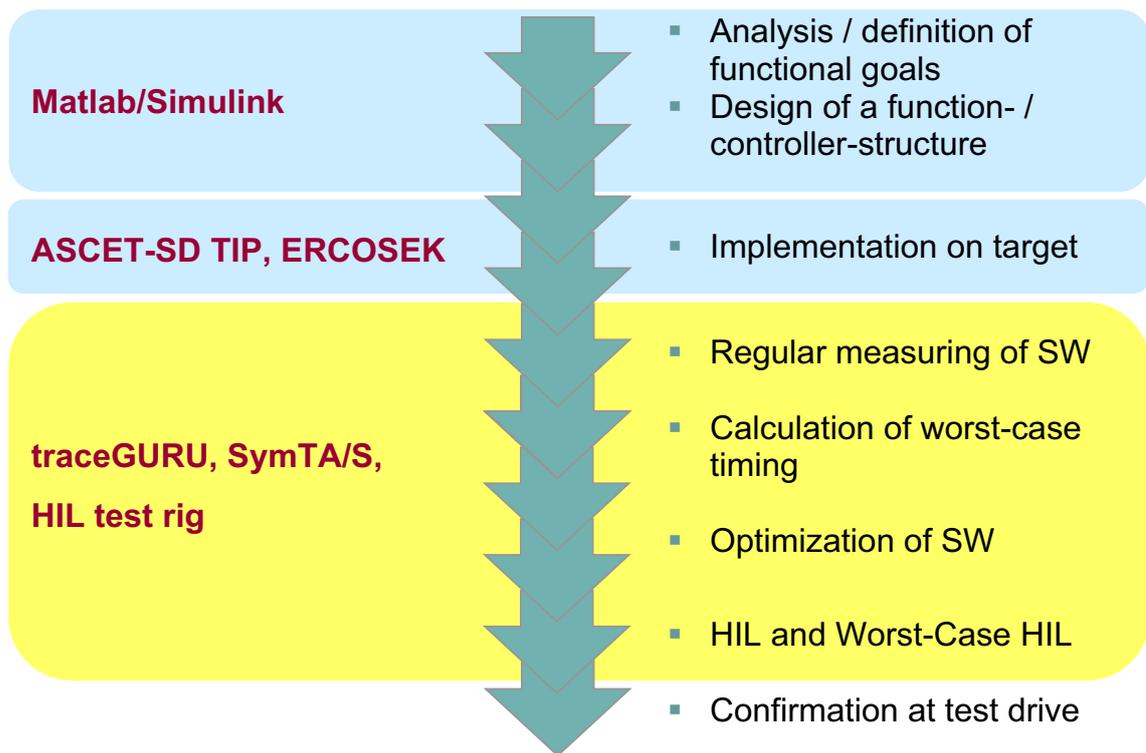
## Goal Conflict

Use of a considerably cheaper, simpler and slower processor hardware at a higher functionality

### Measures:

- Constant control with measuring and visualization tools **traceGURU** (Gliwa GmbH)
- Use of Scheduling Analysis tool **SymTA/S** (Symtavision)
- Setup of networked “hardware in the Loop” test rig with “worst-case” configuration

## Development Process Tool Chain



## Development Use of timing tools

Timing tools were used for the following actions:

- Processor selection
- Execution time measurements for Integration stages (releases)
- Design of timing layout
- Relaxation of run time situation
- Measurement of individual functions
- Optimization of run times
- Detection of timing problems
- Verification of timing corner-cases

# Use of Timing Tools

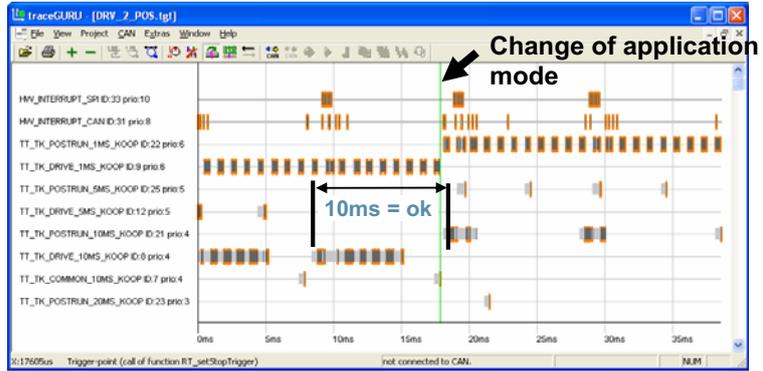
## Debugging of timing problems I

Use of *traceGURU* as debugging tool for specific timing problems

**Example:** A significant deviation from the given 10 ms period occurs occasionally for CAN messages

*Cause:* timers were reset during “application mode changes”, so that the required 10 ms pattern was violated

*Solution:* Adjusting the delays of periodic tasks which operate the CAN driver



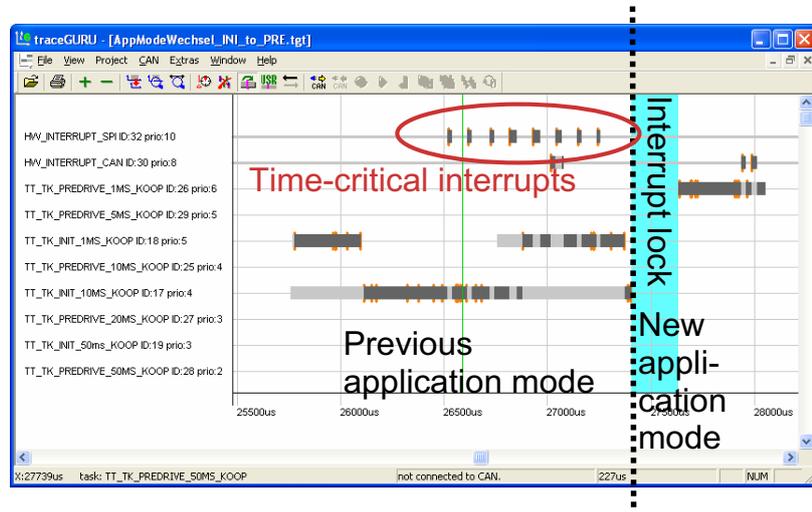
# Use of Timing Tools

## Debugging of timing problems II

**Example:** Infrequent error occurring at the calculation of the delay angle

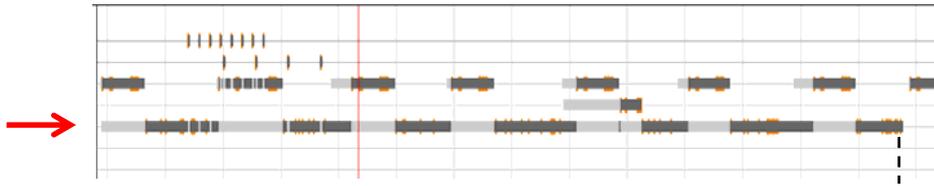
*Cause:* Coincidence of a series of time-critical interrupts and application mode change. This causes a longer disabling of interrupts at a particularly **short(!)** run time of the 10 ms task.

*Solution :* A modified timing layout and deterministic switch of the application mode, this provides that the interrupts cannot coincide with the lock.

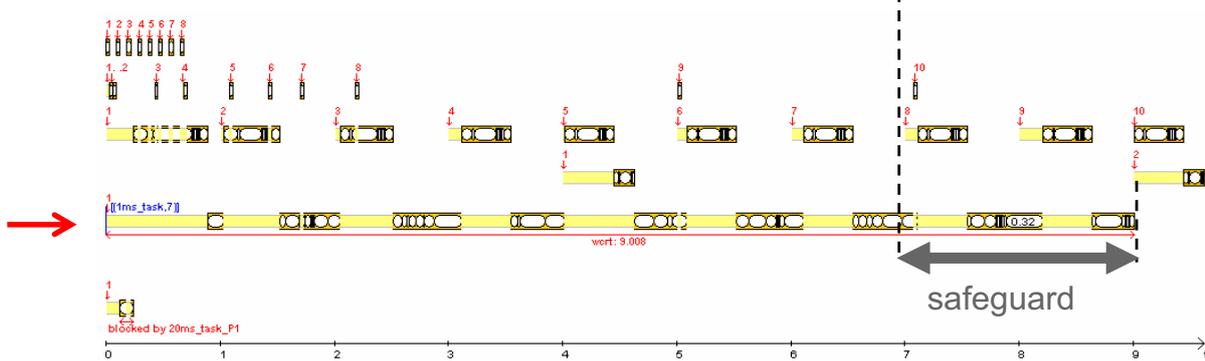


# Comparison of Tracing and Scheduling Analysis

- **Measurement:** Response time **6.9ms**  
 4 CAN, 8 SPI interrupts, 7 preemptions by 1ms task

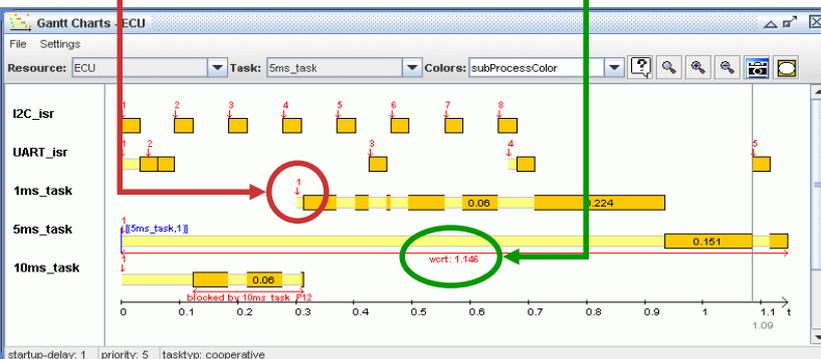
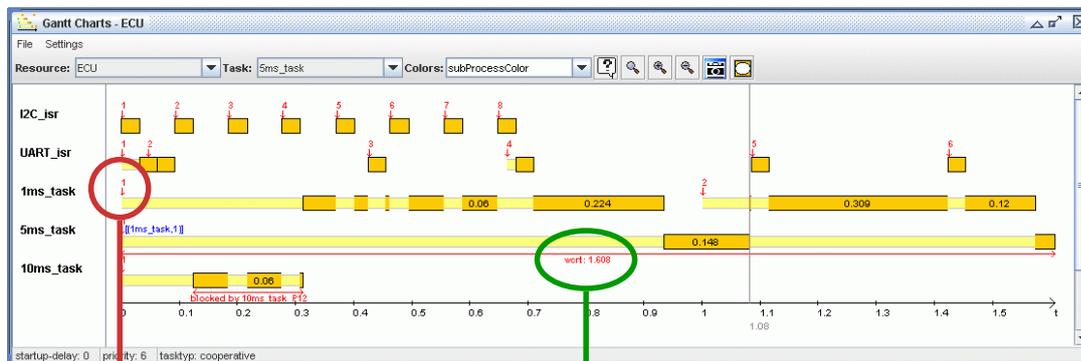


- **Worst-Case Analysis with SymTA/S:** Response time **9ms**  
 10 CAN, 8 SPI Interrupts, 9 preemptions by 1ms task, **blocking**



## Optimization: Delayed task activation

Use of **SymTA/S** for delay optimization



**Response time 5ms Task**  
**Previous: 1.608 ms**  
**New: 1.146 ms**

## Use of timing tools

### Processor selection

Goal:

Cost reduction at higher functionality

*Situation:* MPC Processor family is set, but which derivative to choose?

- a derivative providing internal flash (as used in the previous project) or
- a derivative without internal flash (slower but lower-priced).

After comprehensive delay analyses (***traceGURU/delayGURU\****, ***SymTA/S***) and an estimation of future functionality the lower-priced alternative without internal flash was selected.

With hindsight the right decision was made: the processor load of the meanwhile completed series software just differs insignificantly from the prediction.

\****delayGURU***: targeted and run time scalable (can be automated if required) delay of the application

## Safety requirements

### Understanding the system

### Predictable, time-stable software behavior

Similar to the software function design (“what is happening?”), the timing behavior is to be defined precisely (“when does it happen?”)

Conclusion: The graphic display showing the execution of tasks, processes, interrupts and arbitrary pieces of code provides completely new insights into the software.

*„You really get to know your system and this enables you to discover runtime errors in a fraction of time.”*

# Summary

- **Strengths of Tracing**
  - Visualization enables a fast understanding of the system
  - Debugging of special, clearly identifiable timing problems
  - Easily connectable to a real ECU and real buses
  - Fast and efficient input of timing data
  
- **Strengths of Scheduling Analysis**
  - Safeguarding against hard-to-find worst-cases
  - Analysis of end-to-end timing
  - Fast optimization of the system configuration
  - Architecture exploration already in early design stages
  
- **The combination enables a fast and effective development.**



# Dataflow analysis for predictable multiprocessor design

*Marco Bekooij*

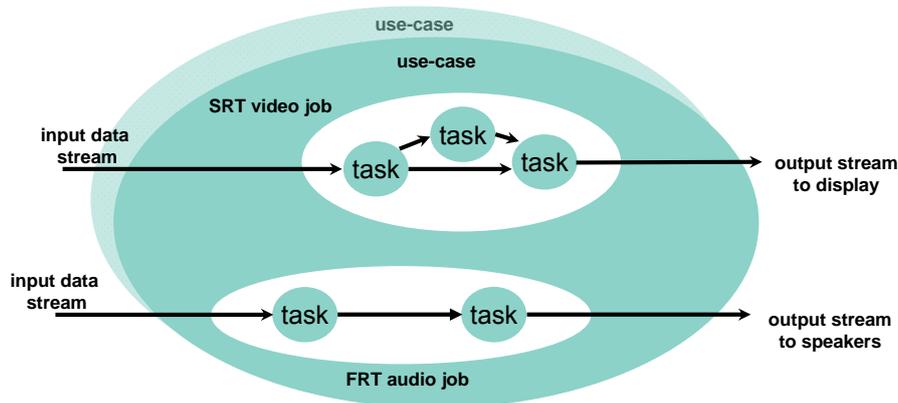


## Outline

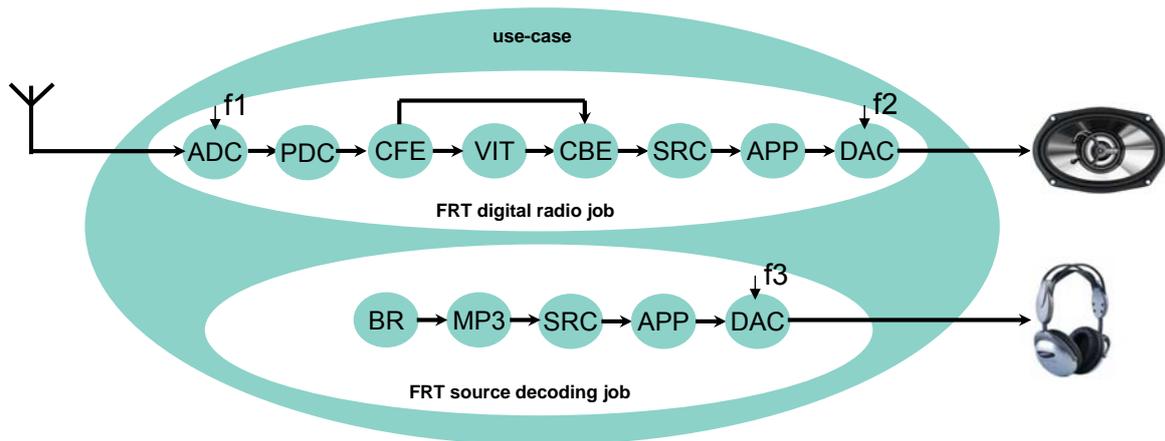
- ▶ Context
  - Stream processing applications
  - Application characteristics
  - Architecture characteristics
  - Design requirements
- ▶ Dataflow analysis techniques
  - Latency-rate characterization of schedulers
  - Cyclic dependencies between tasks
  - Single rate dataflow analysis
- ▶ Summary

# Application model

- ▶ Jobs are *composed of tasks*
- ▶ Simultaneously running jobs *together form use-cases*
- ▶ Jobs often have *real-time requirements*
  - Firm (FRT) if deadline misses are *highly undesirable: steep quality degradation*
  - Soft (SRT) if occasional *deadline misses are tolerable*



# In-car infotainment use-case

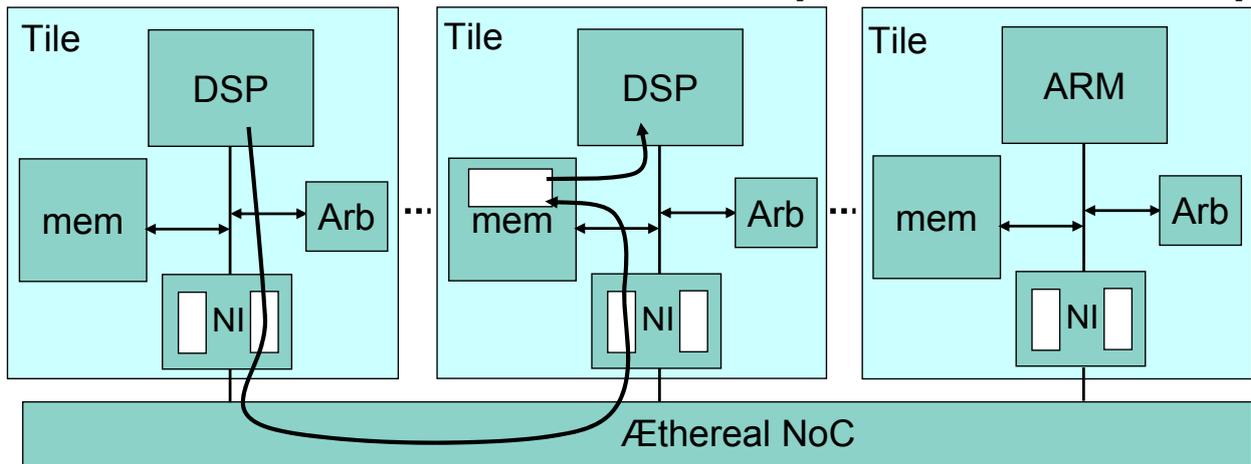


- ▶ Observations:
  - Reactive system because stream from transmitter cannot be slowed down
  - Firm real-time jobs because deadline misses are highly undesirable but not catastrophic
  - Both streams are equally important
  - Throughput constraints dominate latency constraints



# Architecture evolution

[A. Moonen et. al., GSPx2005]



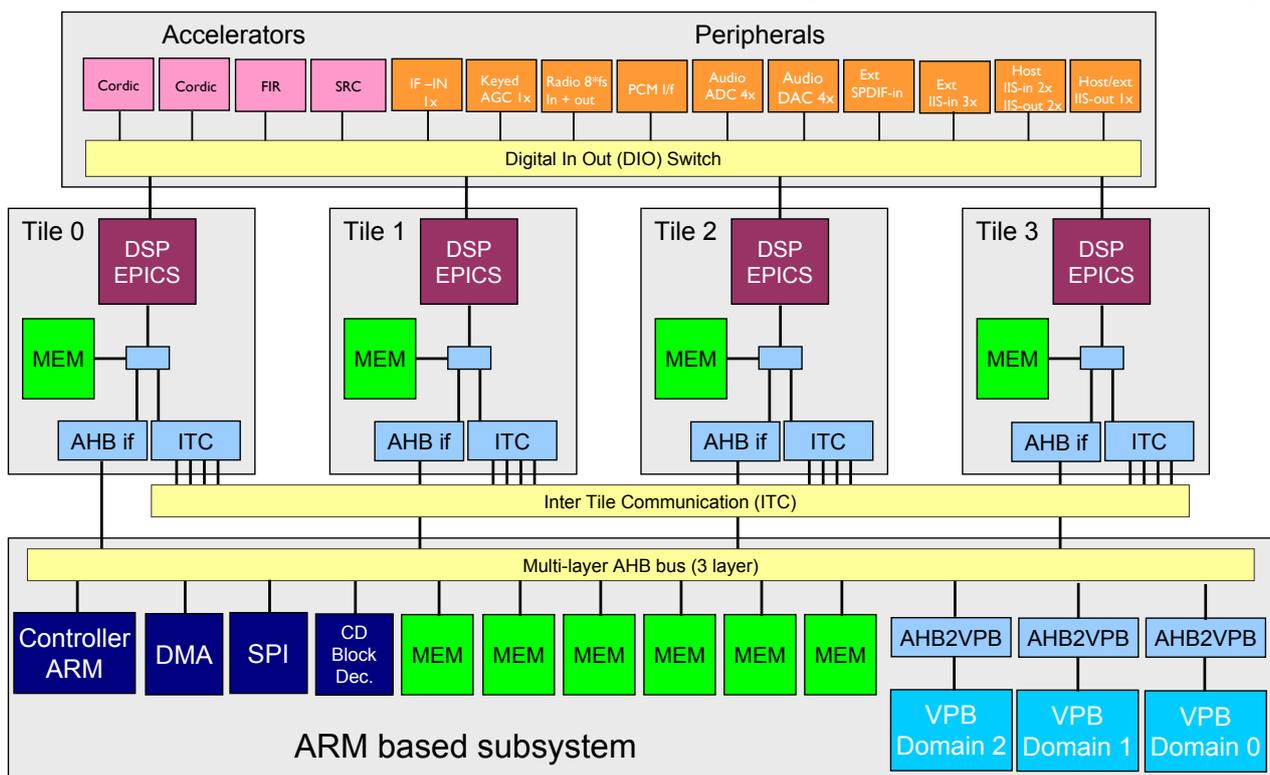
- Statically configured connections + communication *with* addresses
- Processors write in destination memory
- On-chip memories preferably small (<256kByte)

FPGA demo [A. Hansson, University Booth, DATE 2008]

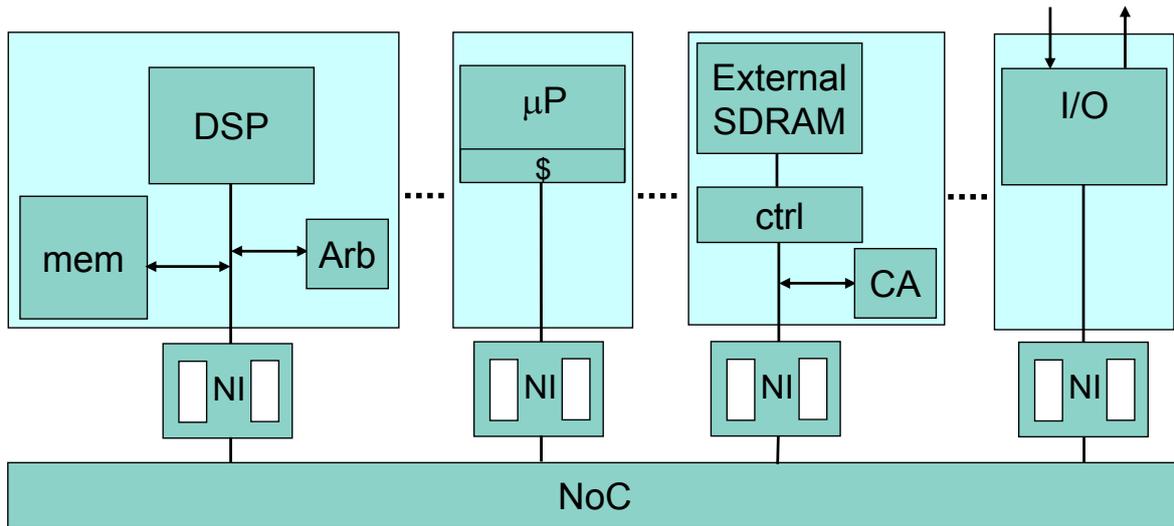


# Car-radio IC of NXP

[A. Moonen et. al., GSPx2005]



## Architecture evolution



- Statically configured connections + communication with addresses
- Large external memory is needed for digital radio channel decoders

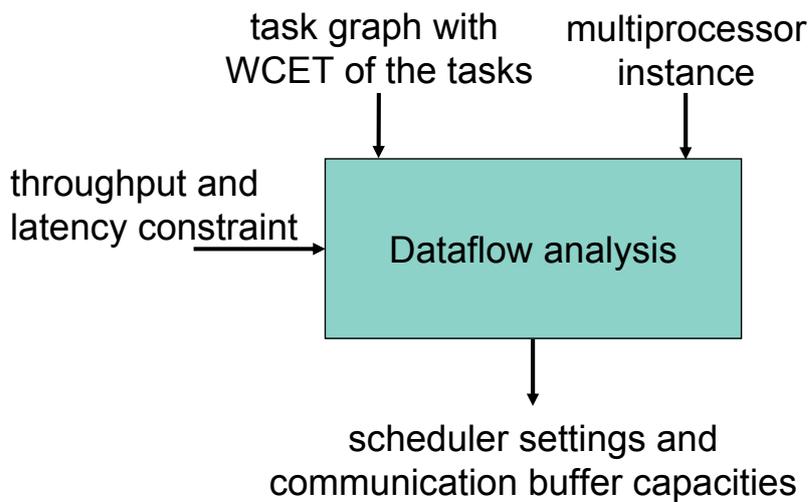
Use of WCET of the tasks is not cost effective!

[M. Bekooij et. al.: Bits & Chips 2007]



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## Dataflow analysis



Guarantee: no deadline misses for all possible input streams



8

# Estimated worst-case execution time (EWCET) of tasks



EWCET= measured upper-bound for the set of test streams

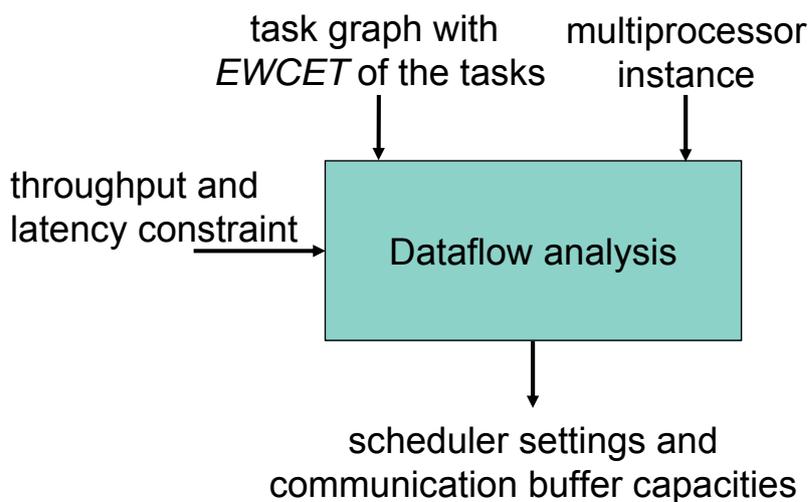
- requires knowledge input data to obtain a tight conservative WCET
- caches and external SDRAM  $\Rightarrow$  large difference average and worst-case

Design requirement:

- guarantee that there are no deadline misses for the set of test streams
  - impractical to do better!



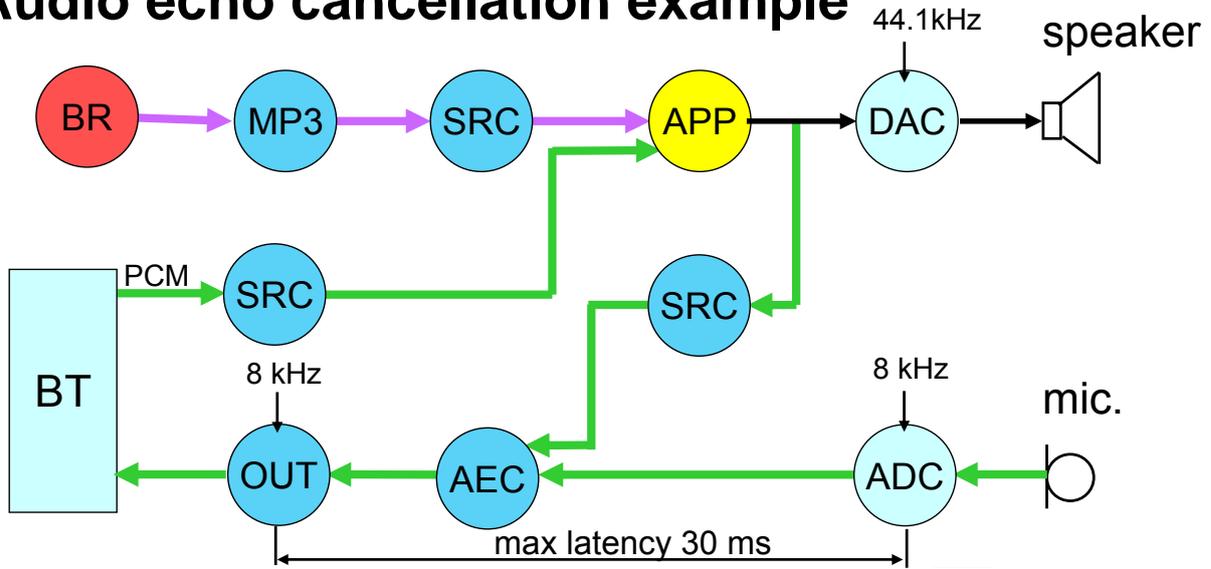
# Dataflow analysis for firm real-time jobs



Guarantee: no deadline misses for ***the set of test streams***



# Audio echo cancellation example

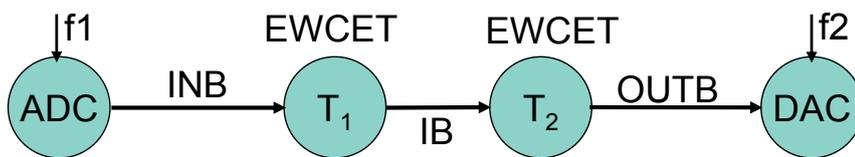


- multiple jobs and streams → →
- real-time constraints: throughput + latency
- PCM stream has external clock
- starting & stopping streams without clicks
- **EW CET of MP3 task**

- ARM7
- DSP1
- DSP2



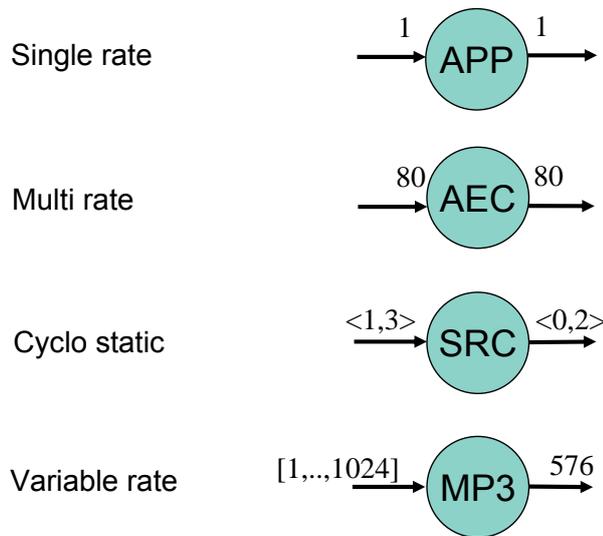
# Overload behavior



- ▶ Execution time (ET) > EW CET ⇒ deadline misses
- ▶ Deadline misses:
  - ▶ Under-run output buffer (OUTB) or overflow input buffer (INB)
  - ▶ Prevent internal buffer (IB) overflow because difficult to handle by tasks
- ▶ Design requirements:
  - ▶ Overflow and under-run should not occur for the set of test-streams
  - ▶ Compensation for ET>EW CET should be supported
  - ▶ Worst-case temporal behavior other jobs should not be affected
    - ▶ Design and verify each job in isolation
    - ▶ Use only WCETs in case of analogue radio jobs



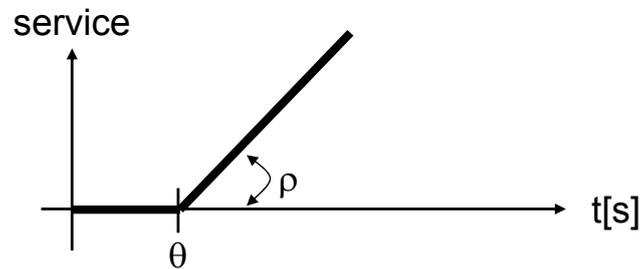
# Advanced task models are needed in the audio echo cancellation application



## Recent extensions dataflow analysis

1. Express effects arbitration in dataflow model
2. Throughput analysis techniques with a low computational complexity
3. Interfacing with environment
4. Latency constraints
5. Data-dependent I/O

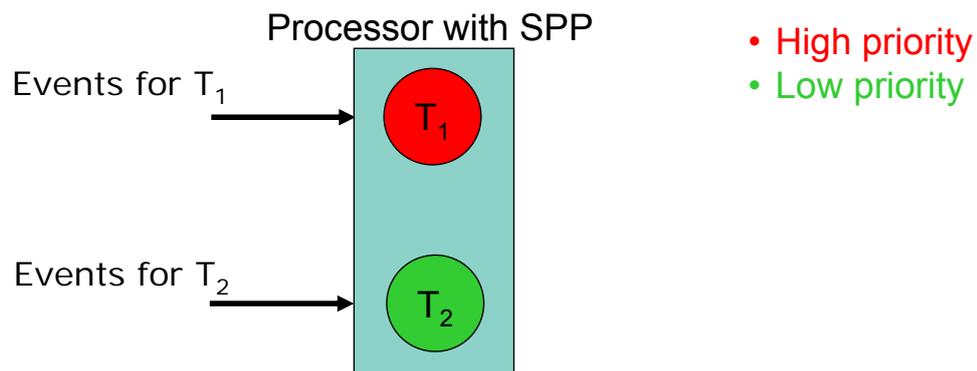
# Requirement dataflow analysis: latency-rate (LR) server characterization of arbiters



All starvation free arbiters can be characterized as an LR-server

- Latency  $\theta$
- Rate  $\rho$

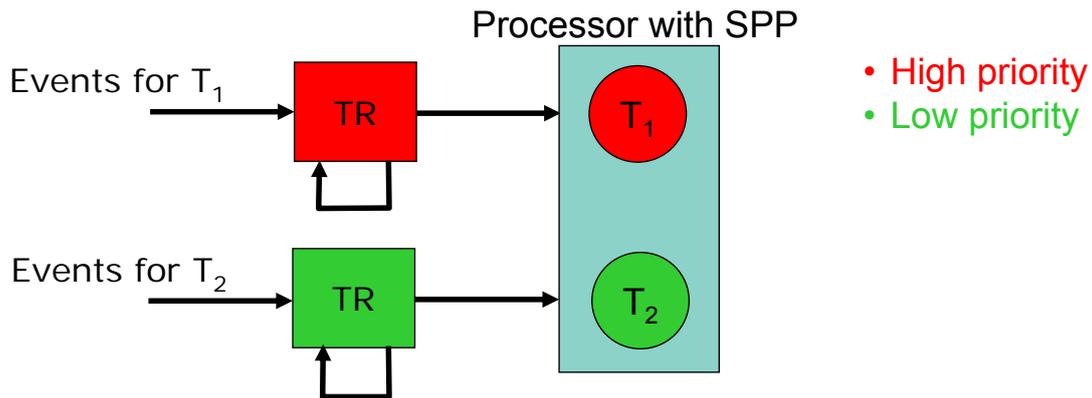
## Static priority preemptive (SPP)



Unknown minimum interval between events  $\Rightarrow$  not an LR- server

- not starvation free; high priority task 1 can prevent execution task 2

## Static priority preemptive with traffic regulator

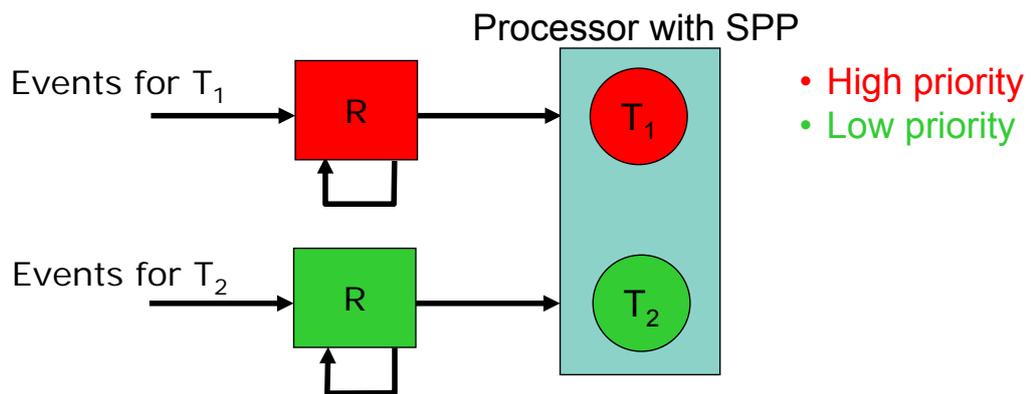


Known minimum time between events + known WCET  $\Rightarrow$  LR- server  
• bounded latency  $\theta$  and minimum rate  $\rho$

## Starvation free arbitration examples

- ▶ Given known WCET
  - Round-robin, weighted round-robin
  - With traffic shapers
    - Static priority preemptive (SPP)
    - EDF
- ▶ Does not require known WCET or minimum distance between events
  - Time division multiplex (TDM)
  - Constant bandwidth server (CBS)
  - Polling server

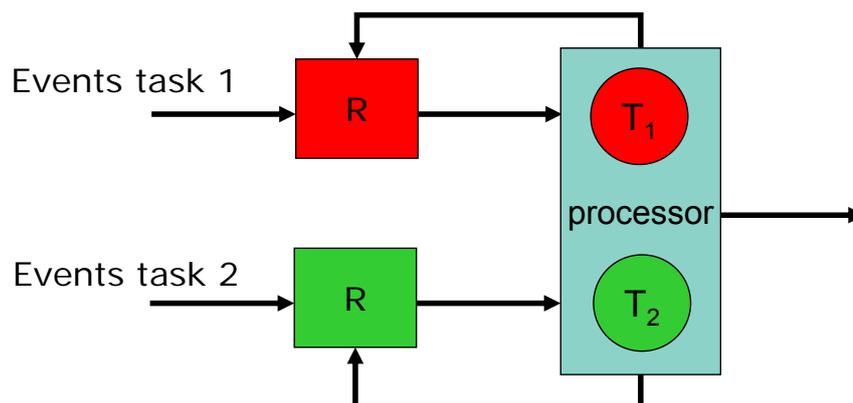
# Characteristics traffic regulation



Traffic regulation does not maximize progress and slack of tasks

- ▶ no events for  $T_1 \Rightarrow$  no earlier starts of  $T_2$
- ▶  $ET_x < WCET_x \Rightarrow$  no earlier starts of  $T_x$

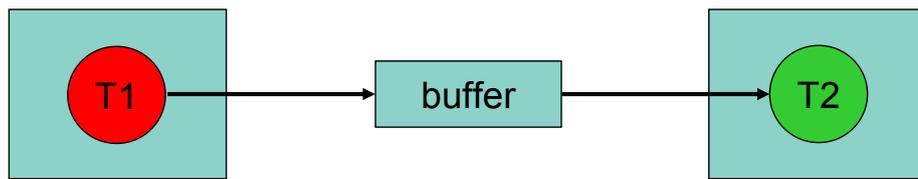
# Characteristics service regulation



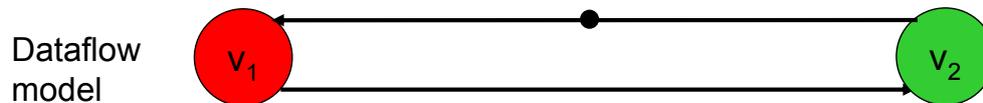
Feedback loop used to maximize progress & bound interference

- no events for  $T_1 \Rightarrow$  earlier starts of  $T_2$
- $ET_x < WCET_x \Rightarrow$  earlier starts of  $T_x$
- feedback loop is often implicit TDM, CBS

# Backpressure



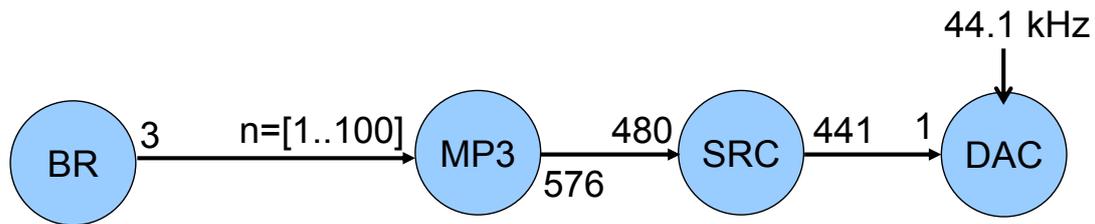
1. Functional determinism  $\Rightarrow$  data may not be lost  $\Rightarrow$  buffer may not overflow
2. WCET of T2 is not known (only EWCEt is known)  $\Rightarrow$  unknown consumption rate  $\Rightarrow$  T1 checks for space
3. Check for space  $\Rightarrow$  backpressure & cyclic dependency



# Cyclic dependencies

- ▶ Cyclic dependencies must be taken into account:
  - Functional cyclic dependencies (e.g. previous frame in video decoder)
  - Maximum buffer capacities can be a constraint (e.g. buffers in interface of the communication network)
  - Consumption or production rate of a task can be data-dependent
- ▶ Trade-off buffer capacity and budget:
  - Higher processor cycle budget for a task  $\Rightarrow$  smaller buffers
- ▶ Tightness of the analysis:
  - Checking space bounds jitter  $\Rightarrow$  smaller buffers
- ▶ Requires analysis techniques with a low computational complexity
  - Analysis of the complete job is done at once

# Variable consumption rate



- ▶ Digital to analog converter (DAC) determines throughput constraint
- ▶ MP3 decoder task consumes variable amount of data
- ▶ Block-reader (BR) task must “know” consumption speed MP3 task
  - Implies cyclic dependency that affects the temporal behavior!

[M. Wiggers et.al., DATE 2008]



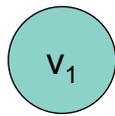
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# Dataflow analysis



24

# Elements of a single-rate dataflow graph



Nodes denote actors



Edges denote unbounded queues



Dots denote tokens

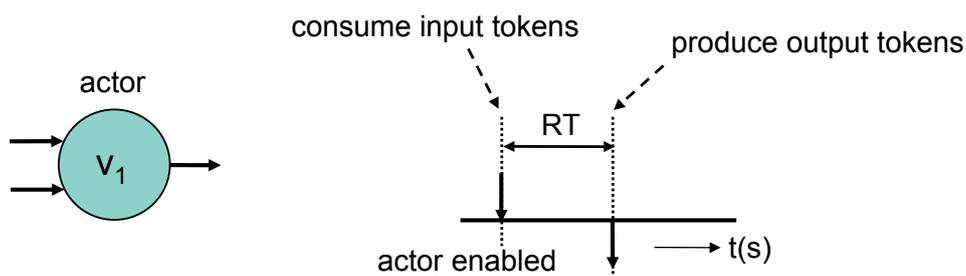
Firing rule = enabling condition

Response time (RT) = interval between enabling and finish



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## Characteristics of a dataflow actor



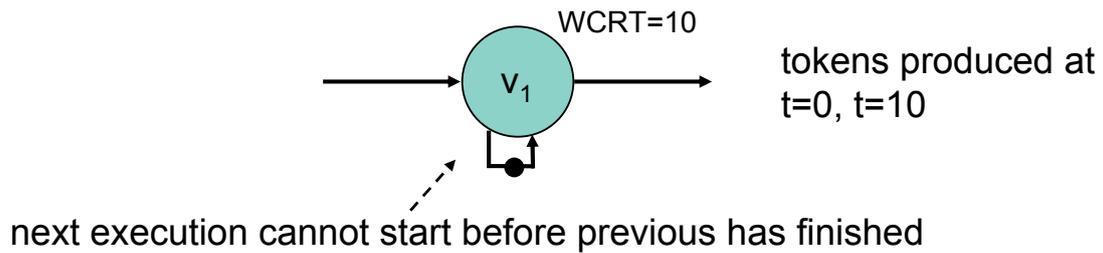
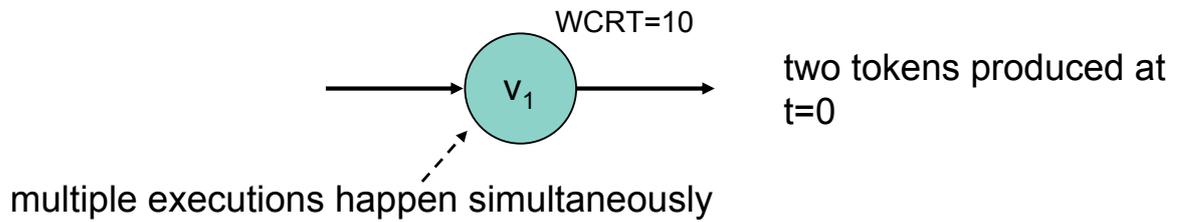
An actor:

- ▶ can represent a quantum of work
- ▶ has a firing rule (e.g. a token on each input)
- ▶ is enabled if the firing condition is satisfied
- ▶ is stateless
- ▶ consumes input tokens when actor starts
- ▶ produces output tokens in zero time when actor finishes its execution

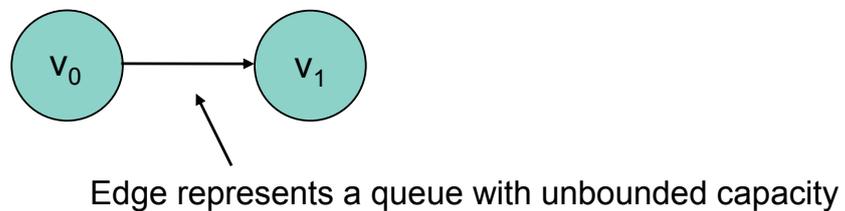


# Auto-concurrency (overlapping execution)

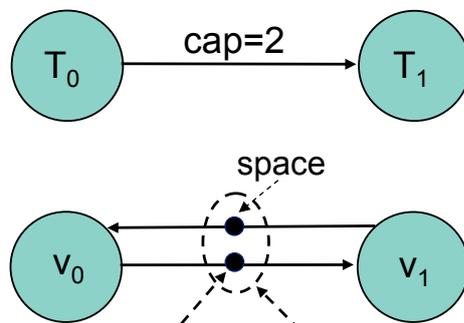
Assume two tokens arrive at  $t=0$



# Unbounded queue



# Bounded FIFO model

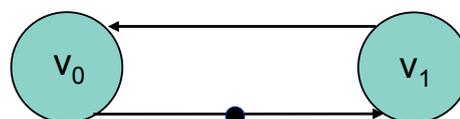


Number of tokens on the cycle equals the FIFO capacity



## Monotonicity

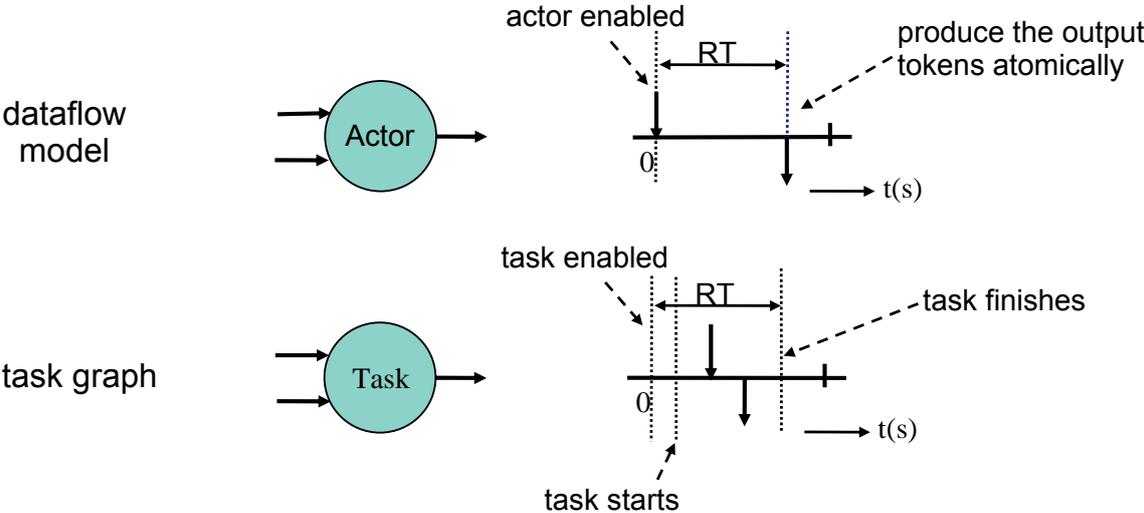
- ▶ Monotonic temporal behavior:
  - An earlier production of a token cannot result in a later start of an actor during self-timed execution
- ▶ Consequence:
  - Sufficient to show that a schedule exist that satisfies the throughput and latency constraints given worst-case response times
  - Smaller response time result in earlier arrival tokens
    - Scheduling anomalies do not occur during self-timed execution of a dataflow model
- ▶ Requires sequential firing rules



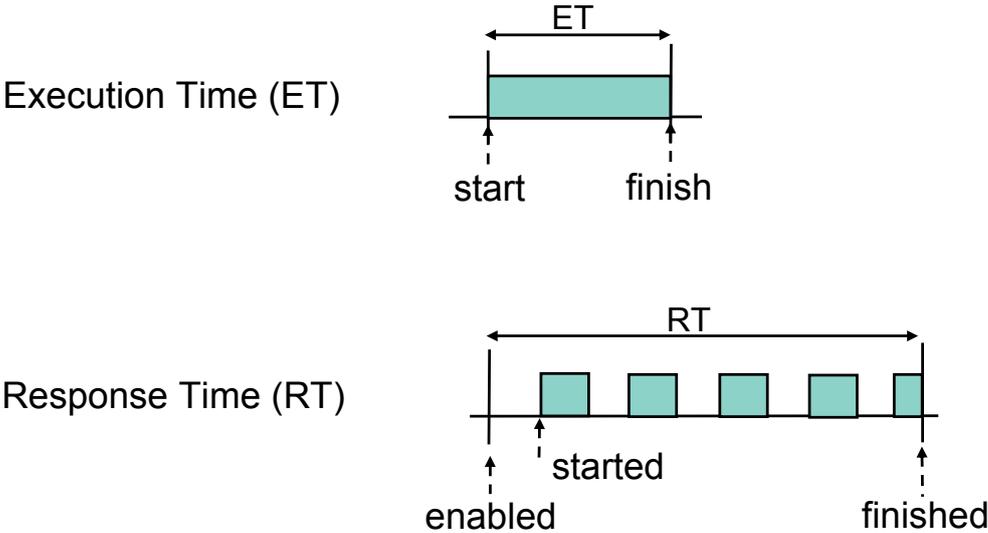
Earlier arrival token results in earlier start  $v_1$  and  $v_0$



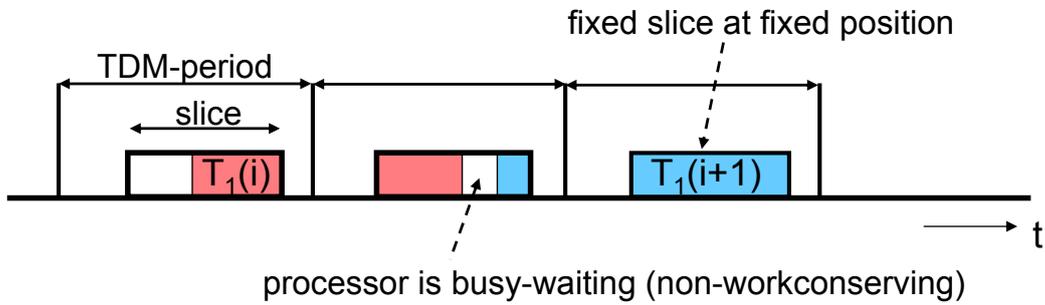
# Tasks versus dataflow actors



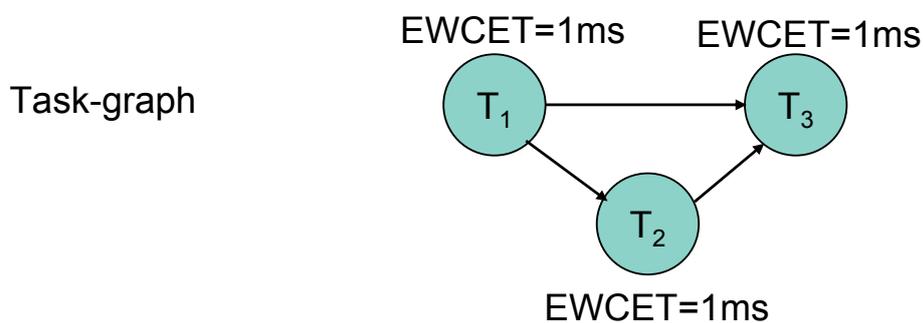
# Response time



# Time Division Multiplex (TDM)



## Throughput analysis



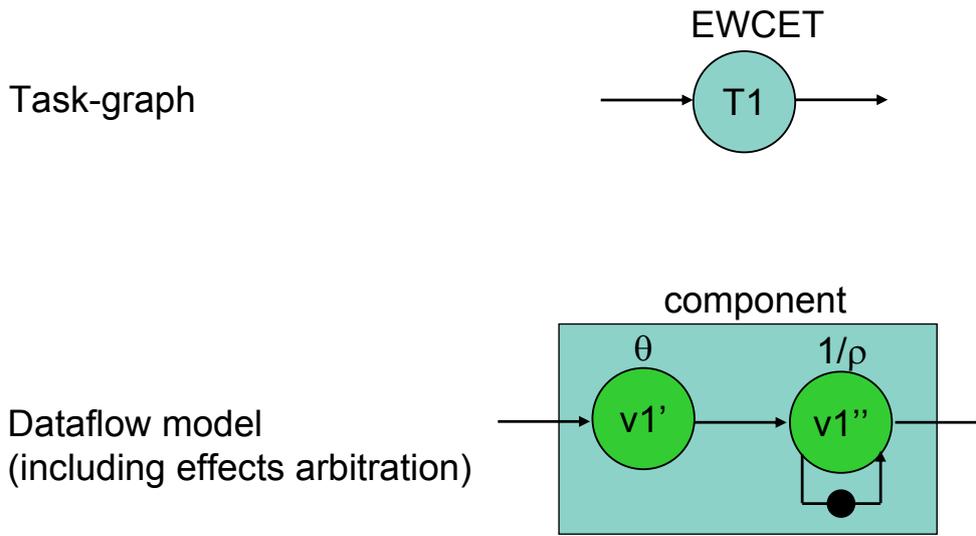
Assume:

- $T_1$  and  $T_2$  share one processor, each task get a TDM-slice of 4 ms every 8 ms
- Infinite buffer capacity

What is the minimum throughput?



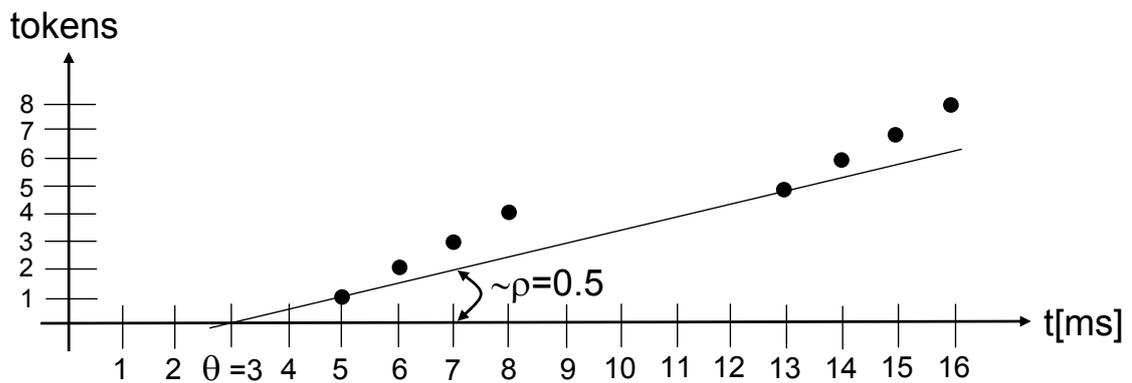
# Dataflow model after latency-rate characterization



[M. Wiggers et.al., Scopes 2006]



## Latency-rate characterization

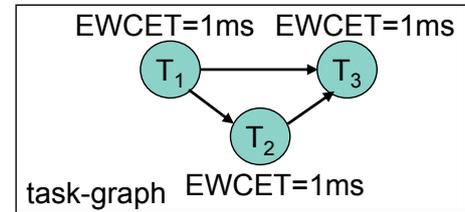


- Latency  $\theta = 3$ ms
- Rate  $\rho = 4/8 = 0.5$  executions/ms

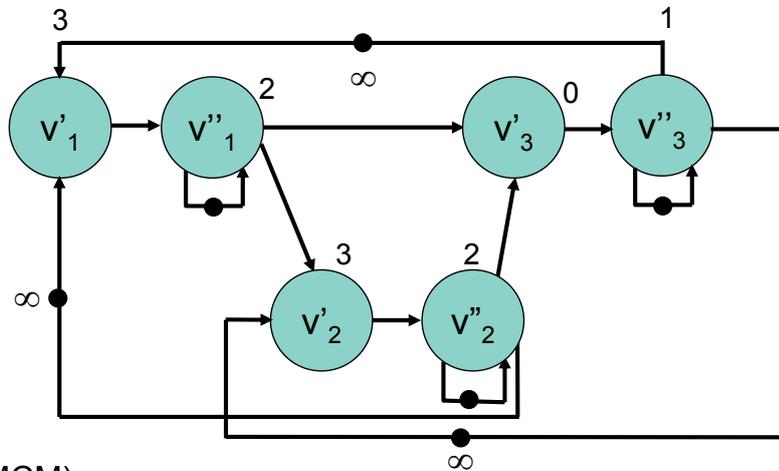


# Throughput analysis

TDM:  $\rho=0.5$  execution/ms,  $\theta=3$  ms



Dataflow model

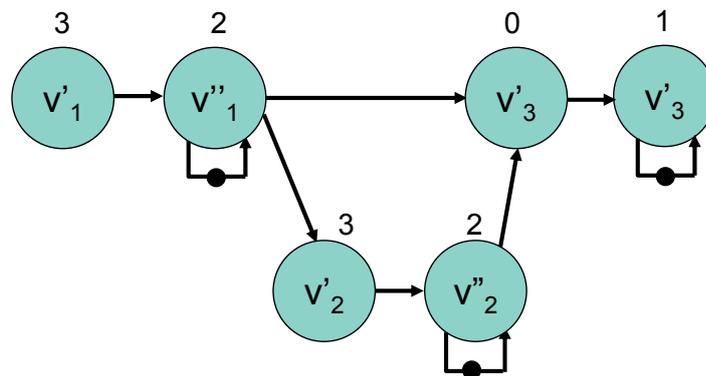


Maximum cycle mean (MCM) =  $\max_{c \in Cg} (\sum_{v \text{ on } c} EWCRT(v)) / \text{tokens}(c) = 2/1 = 2 \text{ ms/execution}$



# Throughput analysis

Dataflow model



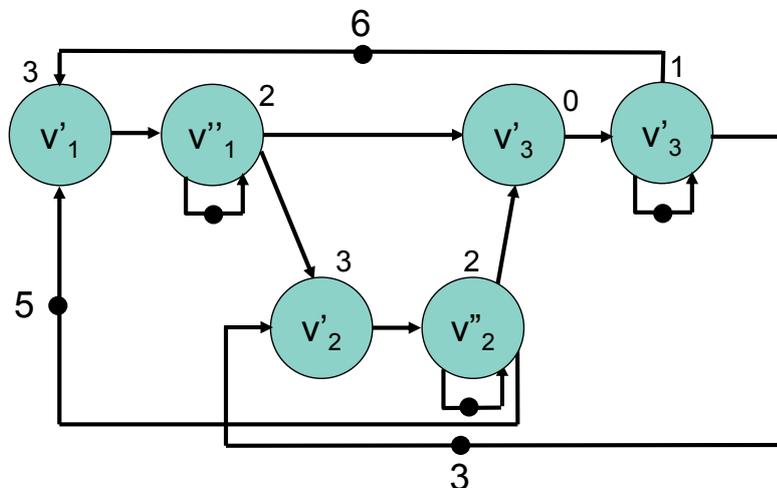
Maximum cycle mean (MCM) =  $\max_{c \in Cg} (\sum_{v \text{ on } c} EWCRT(v)) / \text{tokens}(c) = 2/1 = 2 \text{ ms/execution}$



# Buffer capacity computation

TDM:  $\rho=0.5$  execution/ms,  $\theta=3$  ms

Dataflow model



Maximum cycle mean (MCM) =

$$\max_{c \in C_g} (\sum_{v \text{ on } c} \text{EWCRT}(v)) / \text{tokens}(c) = 2/1 = 2 \text{ ms/execution}$$



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## Summary

- ▶ Introduced dataflow analysis techniques to compute buffer capacities and scheduler settings given throughput and latency constraints
- ▶ Dataflow analysis techniques are applicable if starvation free arbiters are applied
  - SPP is not starvation free
- ▶ Service regulation: bound interference + reduce miss-probability
  - Compared to traffic regulation
  - Space must be available before task can start  $\Rightarrow$  cyclic dependencies
- ▶ Sufficient to show at design-time that a schedule exist
  - Due to monotonic temporal behavior of self-timed dataflow graphs
- ▶ Multiprocessor architecture includes processors with caches
  - Use of WCETs is not cost-effective, use EWCET instead



40

## References

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- ▶ S. Sriram and S. S. Bhattacharyya. Embedded Multiprocessors: Scheduling and Synchronization. Marcel Dekker Inc., 2000
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- ▶ M. Wiggers, M. Bekooij, and G. Smit. Modelling Run-Time Arbitration by Latency-Rate Servers in Data Flow Graphs. In *Proc. Int'l Workshop on Software and Compilers for Embedded Systems (SCOPES)*, April 2007.
- ▶ M. Wiggers, M. Bekooij, P. Jansen, and G. Smit. Efficient Computation of Buffer Capacities for Cyclo-Static Real-Time Systems with Back-Pressure. In *Proc. IEEE Real-Time and Embedded Technology and Applications Symposium (RTAS)*, April 2007.





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# Formal Methods in System and MpSoC Performance Analysis and Optimization

-- Combining State-based and Functional Models --

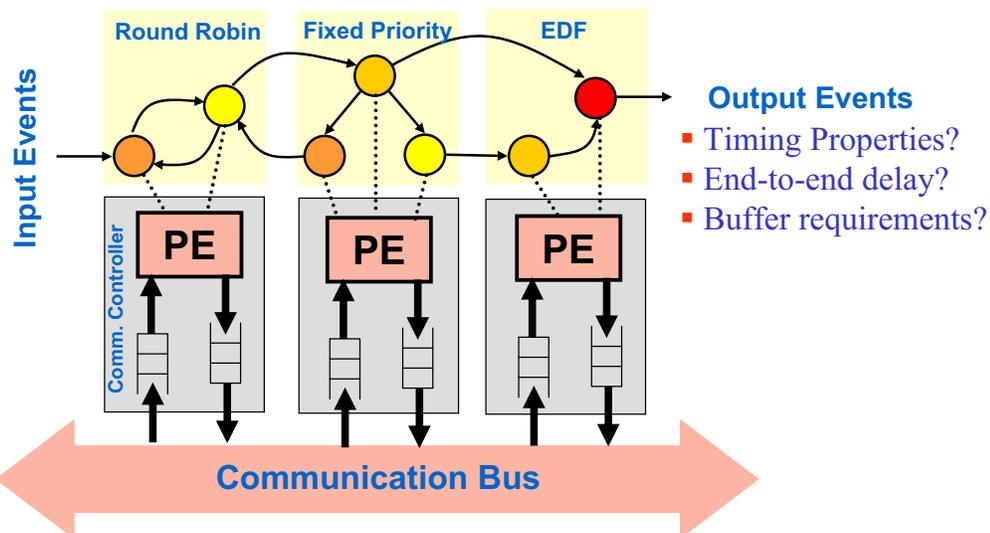
**Samarjit Chakraborty**  
National University of Singapore



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## Performance Analysis Problem

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- Tasks have different activation rates and execution demands
- Each computation/communication element has a different scheduling/arbitration policy

# Performance Analysis Challenges

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- Heterogeneous processing elements
- Different scheduling policies (e.g. EDF, Rate Monotonic, Round Robin, etc.)
- Wide variation in task execution times
- Different bus protocols (e.g. TDMA, FCFS etc.)
- Irregular event arrival patterns

## Solution: Use Simulation

---

- SimpleScalar ([www.simplescalar.com](http://www.simplescalar.com)) Instruction Set Simulator and SystemC ([www.systemc.org](http://www.systemc.org)) for transaction-level modeling and simulation
- Disadvantages
  - Excessive running times
  - Insufficient corner case coverage
  - No formal guarantees
  - Difficulty in integration

## Solution: Analytical Methods

---

- Standard event models [Richter *et al.* 2002, Yi. *et al.* 2004, etc.]
  - Periodic, sporadic events
  - Using classical scheduling theory from the real-time systems literature
- Real-time Calculus [Chakraborty, Kunzli and Thiele 2003]
  - Models general event streams and resource availability
    - Bursty arrival patterns, irregular resource availability
  - Represents arrival/service patterns as functions
  - Uses min/max-plus algebraic framework for analysis

## Solution: Analytical Methods (cont.)

---

- Event Count Automata  
[Chakraborty, Phan and Thiagarajan 2005]
  - Represents event streams and resource availability as automata
  - Accepts integer sequences, which represent all possible permissible arrival/service patterns
  - Uses automata verification techniques (e.g. model checking) for analysis

## Different Possibilities: Comparison

Criteria \ Methods	Standard Event Models (SEM)	Real-time Calculus (RTC)	Event Count Automata (ECA)
<i>Design scope</i>	★	★ ★	★ ★ ★
<i>Efficiency</i>	★ ★ ★	★ ★ ★	★
<i>Accuracy</i>	★	★ ★	★ ★ ★

A modeling technique that is:

- Expressive enough
- Efficiently analyzable



**Combinations of two or more models**

## Integrating Multiple Performance Models

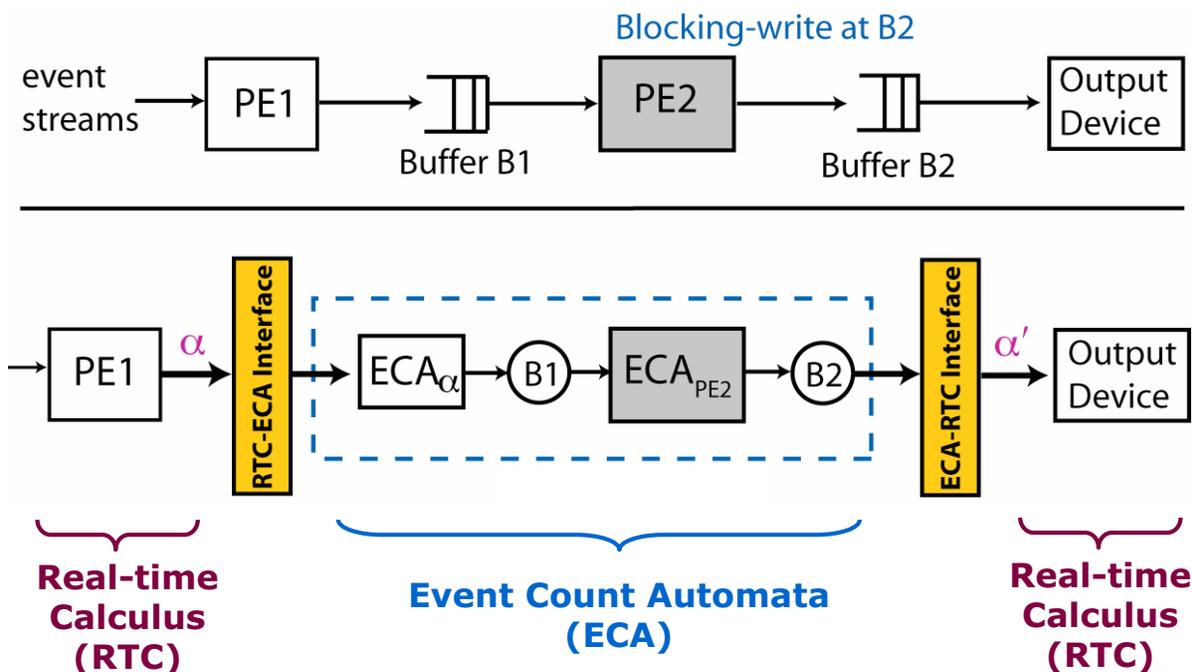
- Simulation + Real-time Calculus [Kunzli *et al.* DATE'06]
- SymTA/S + Real-time Calculus [Kunzli *et al.* CODES + ISSS'07]
- Synchronous Data Flow graphs + Standard Event Models [Schliecker *et al.* DATE'07]

- **Provides the required amount of modeling power**
- **Without incurring excessive analysis complexity**

# This Talk

- Composing a functional and state-based model
  - Real-time Calculus (RTC): efficient
  - Event Count Automata (ECA): expressive
- Technical Challenge: An *interfacing* technique for composing RTC and ECA
  - RTC: functional, requires algebraic techniques for analysis
  - ECA: state-based, requires more expensive state space exploration techniques
- Advantages
  - Formal performance guarantees
  - Expressive, but analysis is not expensive

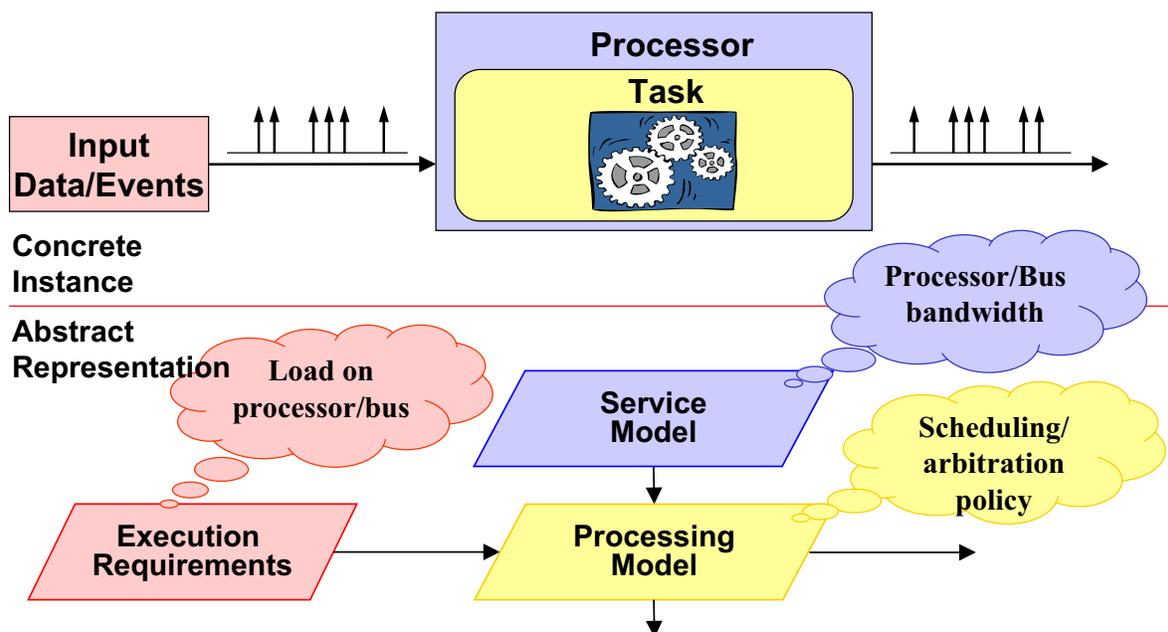
## ECA-RTC Interfacing



# System Modeling

- Both RTC and ECA rely on a **count-based abstraction** for modeling workload and service
  - *How many* events can arrive over any time window of length  $\Delta$ ?
  - *How many* events may be processed with any time window of length  $\Delta$ ?
- RTC models such information as functions and uses algebraic techniques for analyzing them
- ECA models such information as automata and relies on state-space exploration techniques

## RTC-Based Modeling: Overview



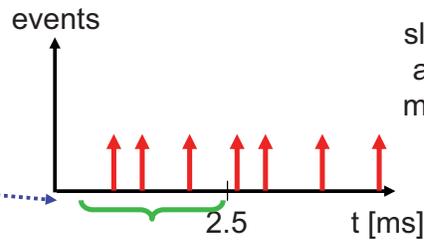
# Event Model – Modeling Execution Requirements

$$\alpha^l(\Delta) \leq R(t+\Delta) - R(t) \leq \alpha^u(\Delta), \forall t, \Delta \geq 0$$



## Arrival Pattern

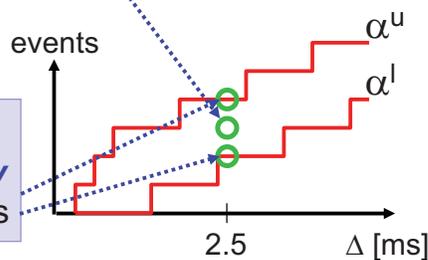
number of events in  $t=[0 .. 2.5]$  ms



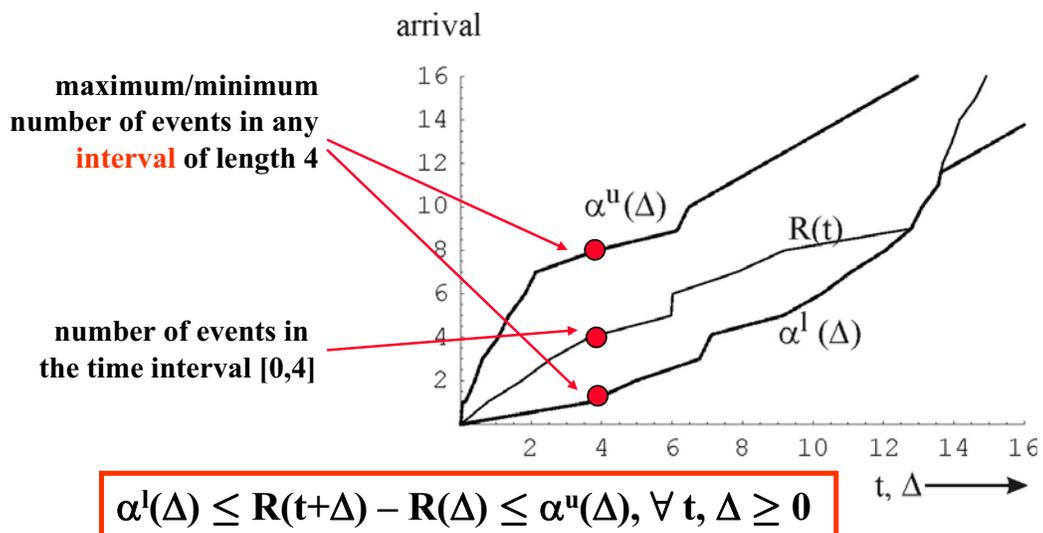
slide window and record max and min

## Arrival Curves $[\alpha^l, \alpha^u]$

maximum/minimum number of events in *any interval* of length 2.5 ms

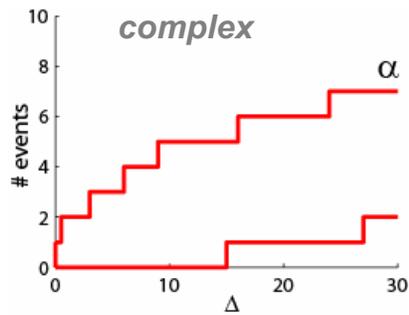
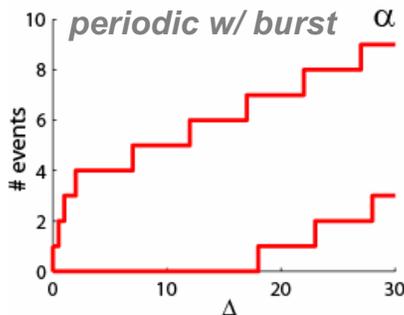
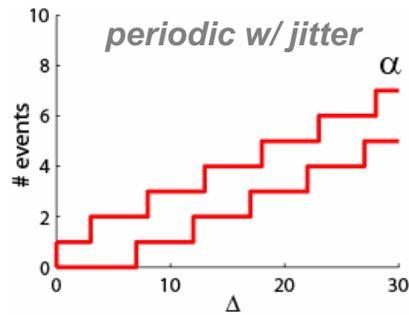
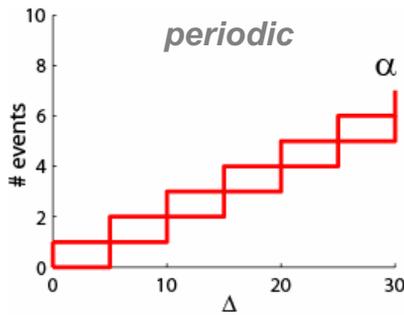
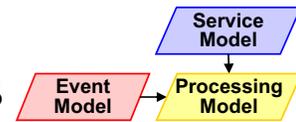


# Event Model – Modeling Execution Requirements



- Max/Min number of events arriving over different time interval lengths

# Event Model - Examples

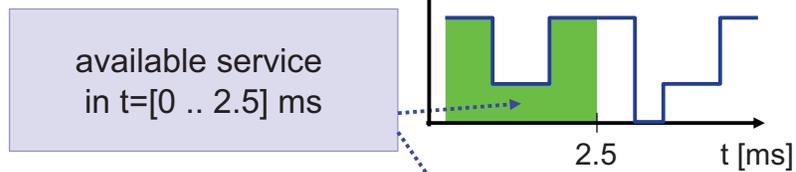


## Service Model – Modeling Resource Availability

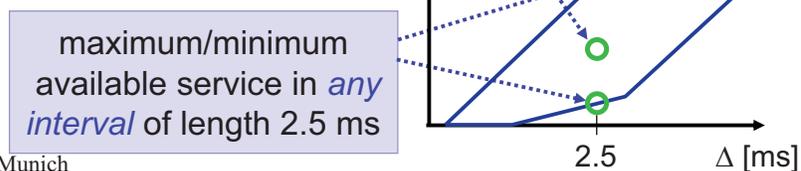
$$\beta^l(\Delta) \leq S(t+\Delta) - S(t) \leq \beta^u(\Delta), \forall t, \Delta \geq 0$$



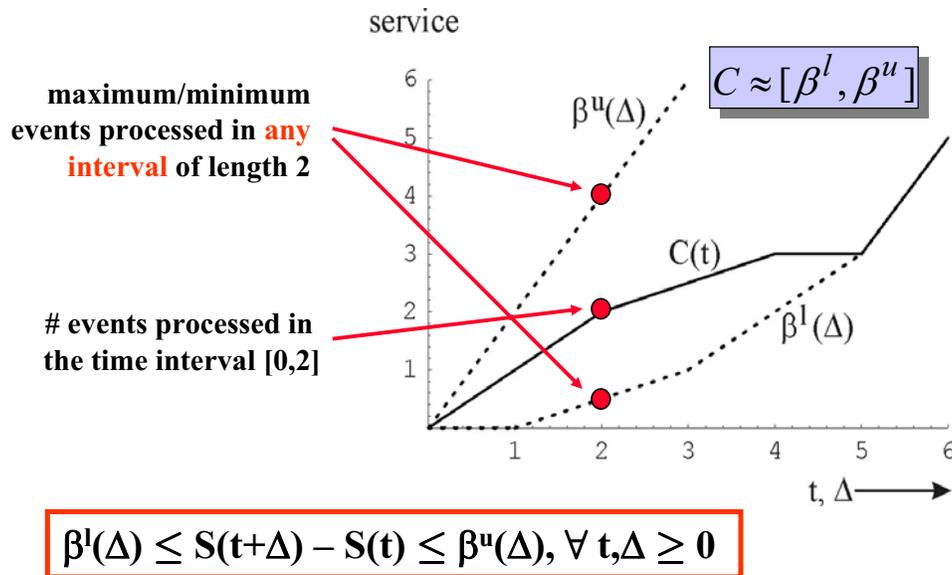
### Resource Availability



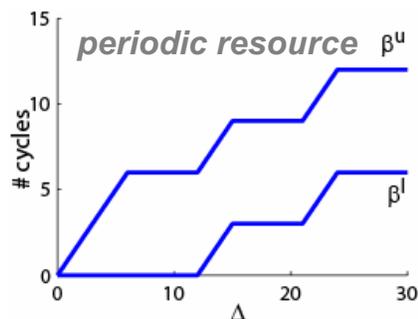
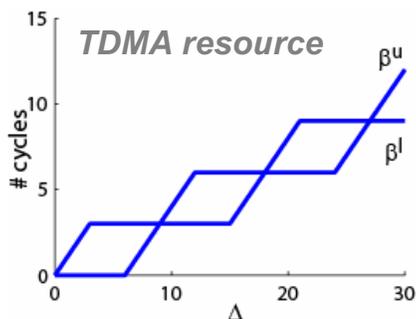
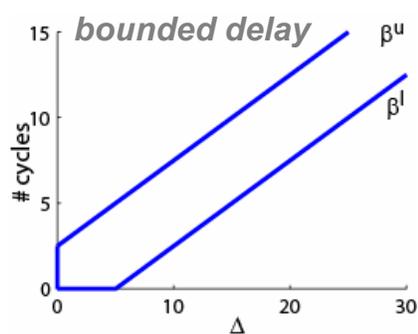
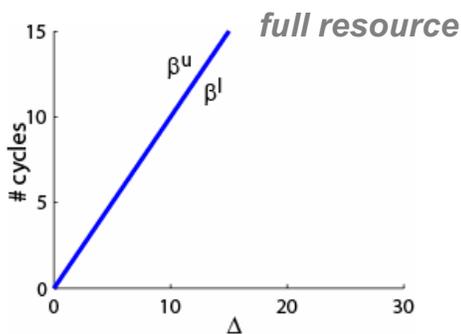
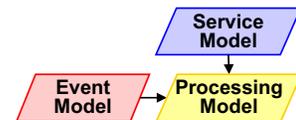
### Service Curves $[\beta^l, \beta^u]$



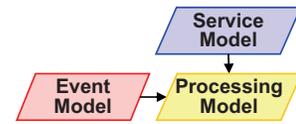
# Service Model – Modeling Resource Availability



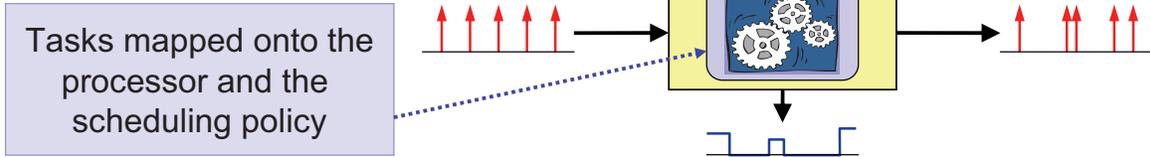
## Service Model - Examples



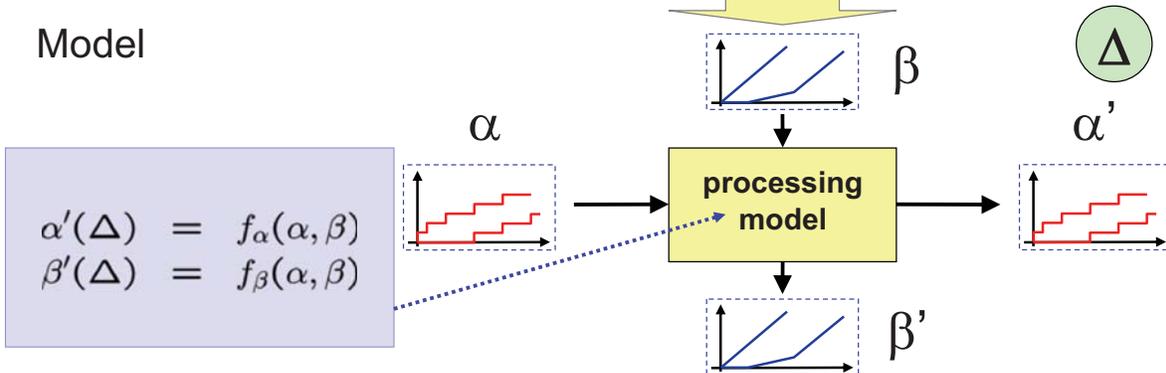
# Processing Model



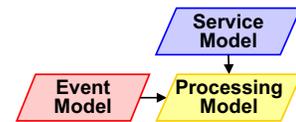
## HW/SW Components



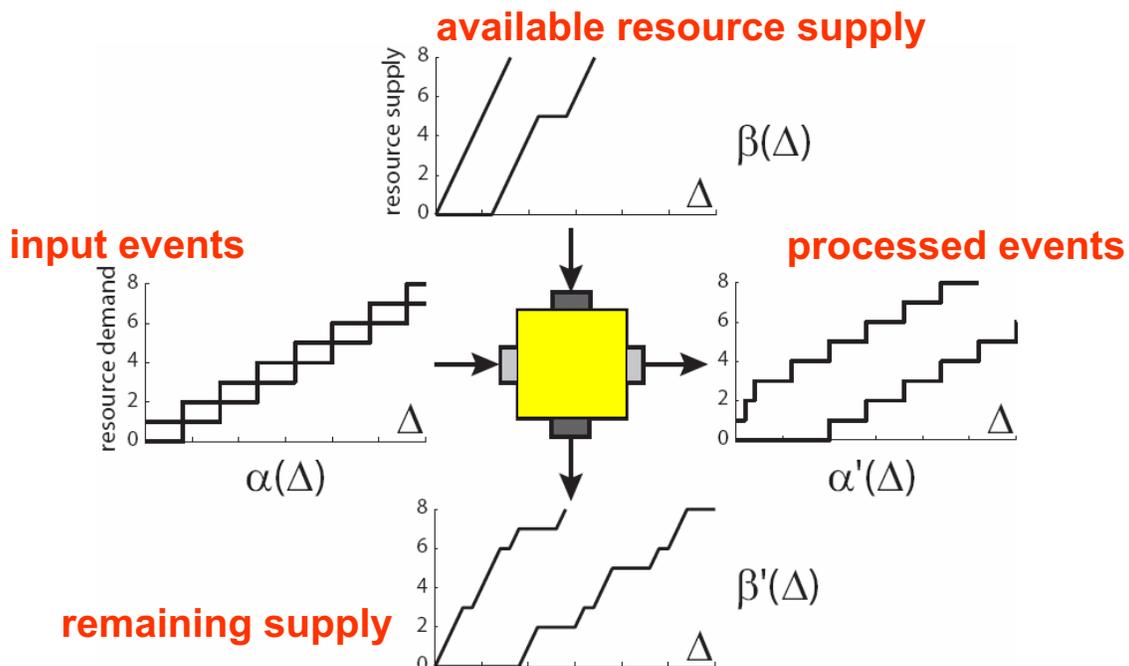
## Model



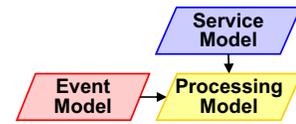
# Processing Model



## Abstract representations of:



# Processing Model



- Computation of
  - Timing properties of the processed events
  - Bounds on the remaining resource

$$v(\Delta) \wedge w(\Delta) = \min \{v(\Delta), w(\Delta)\}$$

$$v(\Delta) \oplus w(\Delta) = \inf_{0 \leq \lambda \leq \Delta} \{v(\lambda) + w(\Delta - \lambda)\}$$

$$v(\Delta) \otimes w(\Delta) = \inf_{0 \leq \lambda} \{v(\Delta + \lambda) - w(\lambda)\}$$

$$v(\Delta) \bar{\oplus} w(\Delta) = \sup_{0 \leq \lambda \leq \Delta} \{v(\lambda) + w(\Delta - \lambda)\}$$

$$v(\Delta) \bar{\otimes} w(\Delta) = \sup_{0 \leq \lambda} \{v(\Delta + \lambda) - w(\lambda)\}$$

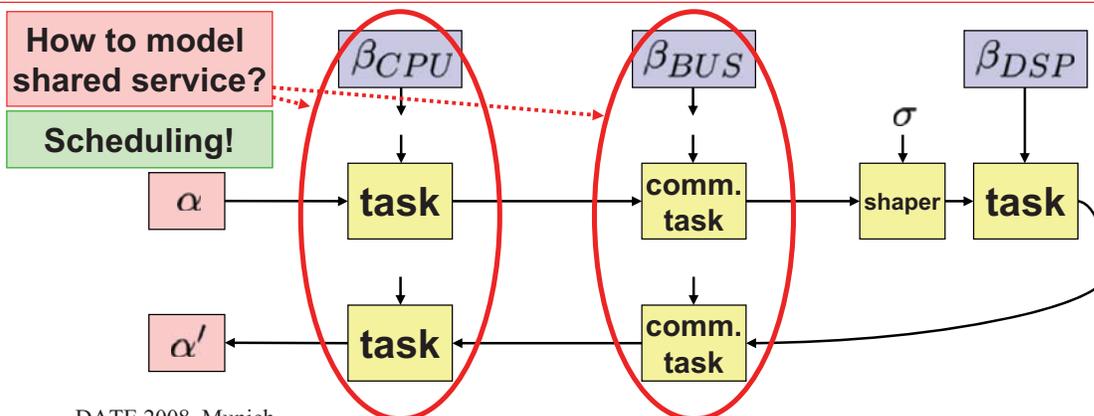
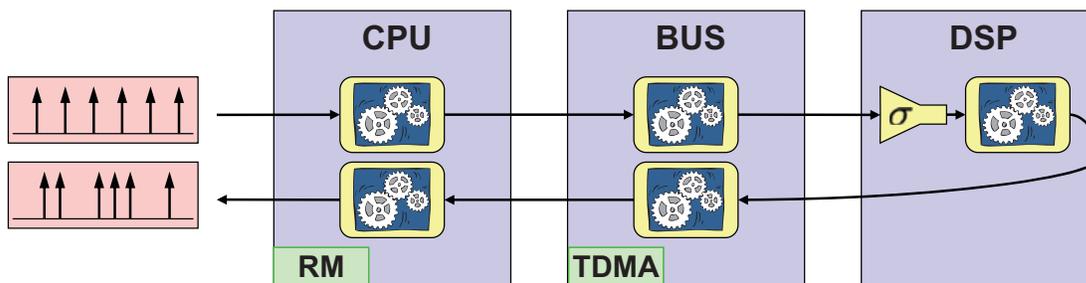
$$\alpha^{u'} = ((\alpha^u \bar{\oplus} \beta^u) \bar{\otimes} \beta^l) \wedge \beta^u$$

$$\alpha^{l'} = ((\alpha^l \bar{\otimes} \beta^u) \oplus \beta^l) \wedge \beta^l$$

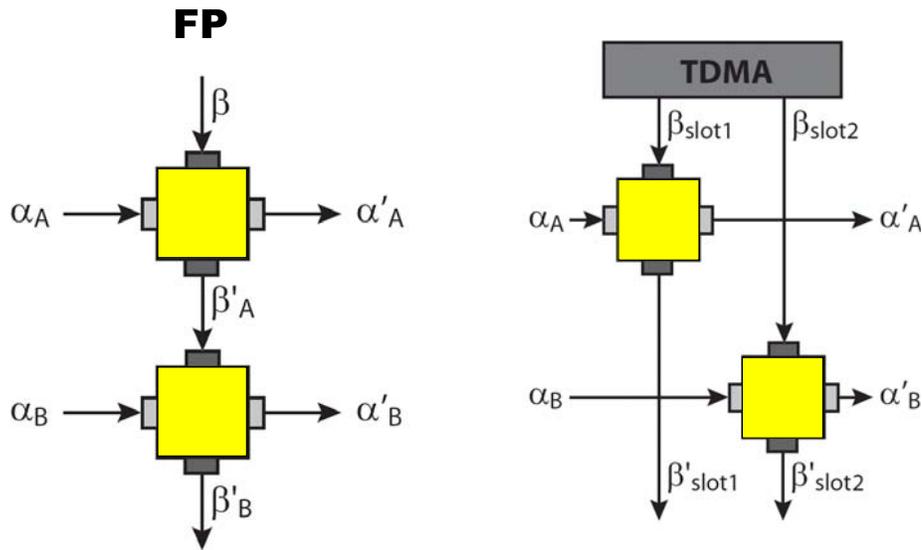
$$\beta^{u'} = (\beta^u - \alpha^l) \bar{\otimes} 0$$

$$\beta^{l'} = (\beta^l - \alpha^u) \bar{\oplus} 0$$

# Compositional Analysis



# Modeling Schedulers

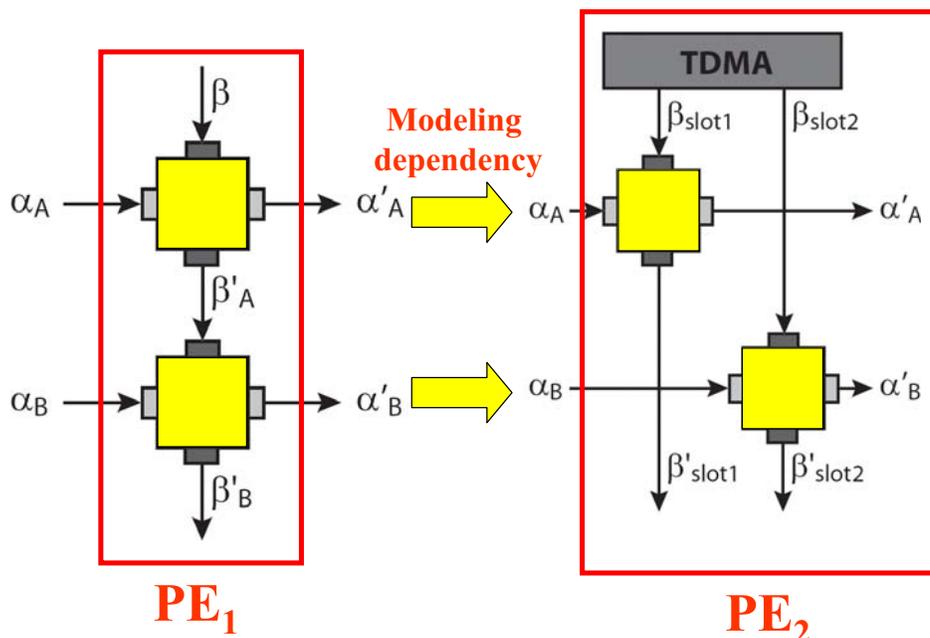


## Using Scheduling Networks

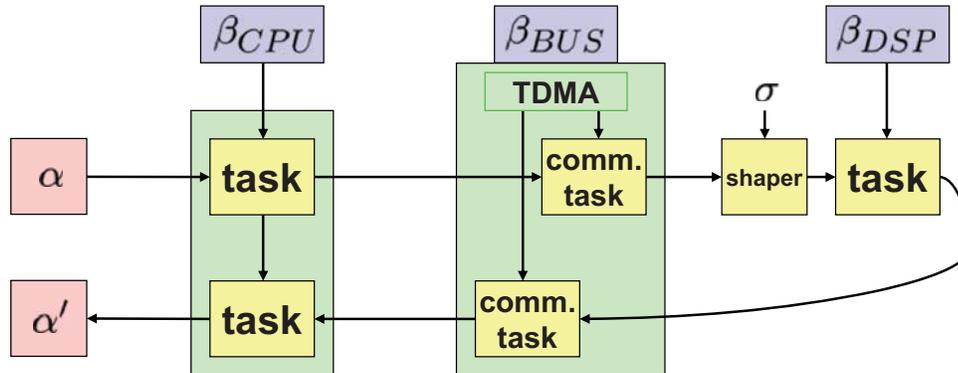
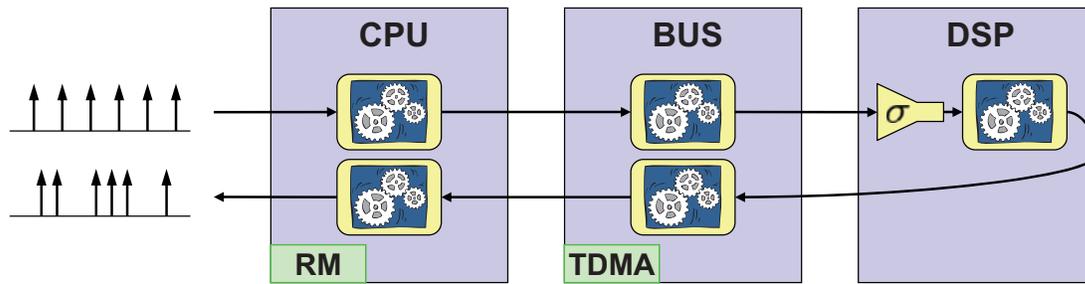
# Compositional Analysis

## Compositional Schedulability/Timing Analysis

- E.g. How much does the jitter increase?



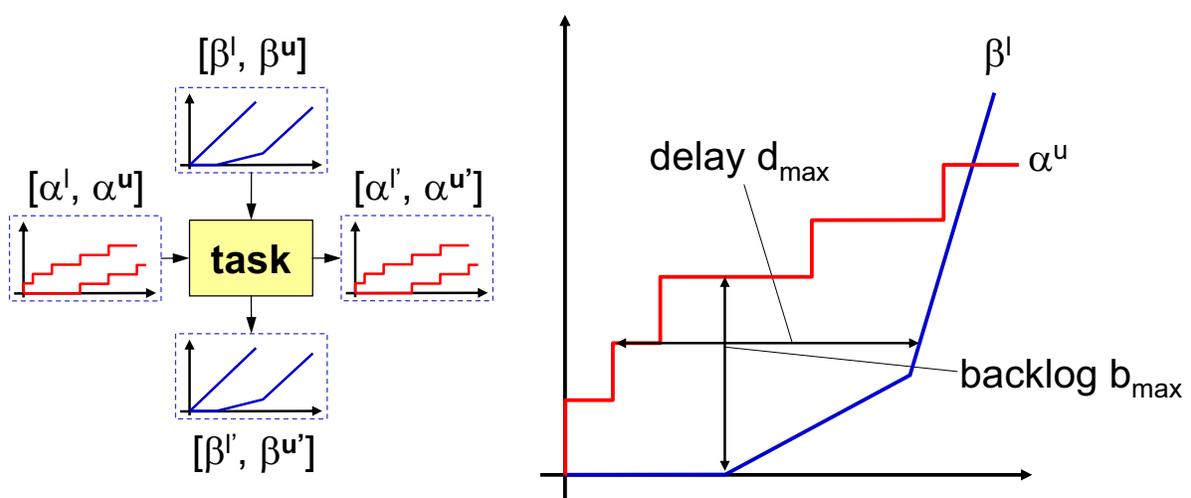
# Compositional Analysis – Complete Example



DATE 2008, Munich

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## Analysis: Delay and Backlog

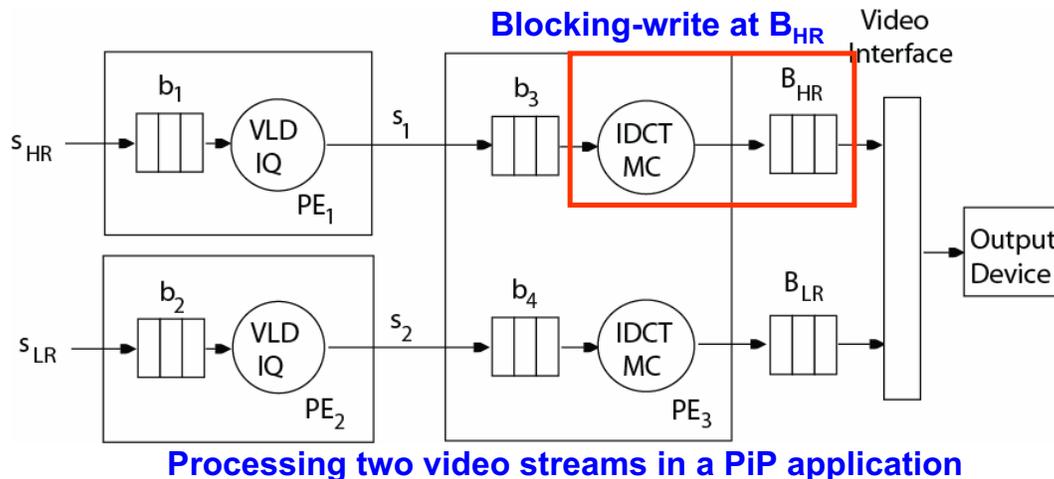


- Max/Min buffer fill level
- Max/Min delay
- Utilization
- ....

DATE 2008, Munich

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## But, We Need to Model *State*!



- The service offered by  $PE_3$  depends on the *state* of the buffer  $B_{HR}$ 
  - Cannot be modeled easily in a functional setting

## But, We Need to Model *State*

- We would like to retain the *count-based abstraction* to specify arrival and service
- But at the same time be able to model systems where the arrival and service depend on the state of the system
- Recently timed automata has been used as a generalization of traditional real-time event models
- But timed automata explicitly records/specifies timing information. Analysis/verification might be expensive ...
- Exact arrival times of data items is not relevant. Rather the number of items that can arrive within a certain time interval is of relevance to us

# Event Count Automata (ECA)

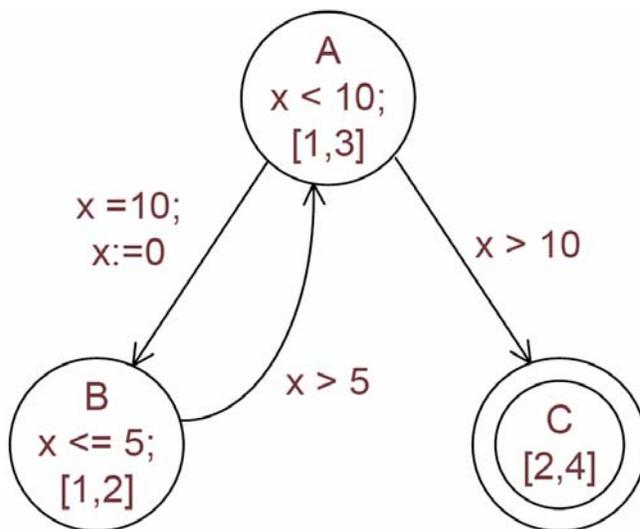
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- Event stream /resource = ECA
- ECA = FSM + *Count variables (CVs)*
  - Records the arrival patterns of a stream and decides to accept or reject the stream
- **CV**: records number of events observed on a stream over a time interval

# Event Count Automata (ECA)

---

State-based modeling of stream processing systems



$A = (S, s_{in}, X, Inv, \rho, \rightarrow, F)$

$S$  = set of states

$s_{in}$  is the initial state

$X$  = set of count variables

$Inv$  = function that assigns to each state an invariant constraint

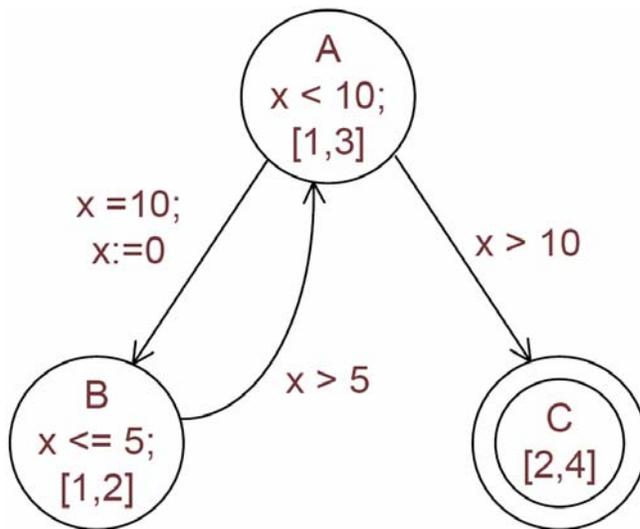
$\rho$  = rate function

$\rightarrow$  = transition relation

$F$  = set of final states

# Event Count Automata (ECA)

---



Arrival pattern =  
3 2 2 3 2 2 2 3 2 4

Corresponding run of the automaton =

(A, 0) → (A, 3) → (A, 5)  
→ (A, 7) → (A, 10)  
→ (B, 0) → (B, 2)  
→ (B, 4) → (B, 6)  
→ (A, 6) → (A, 9)  
→ (A, 11) → (C, 11)  
→ (C, 15)

## ECA - Properties

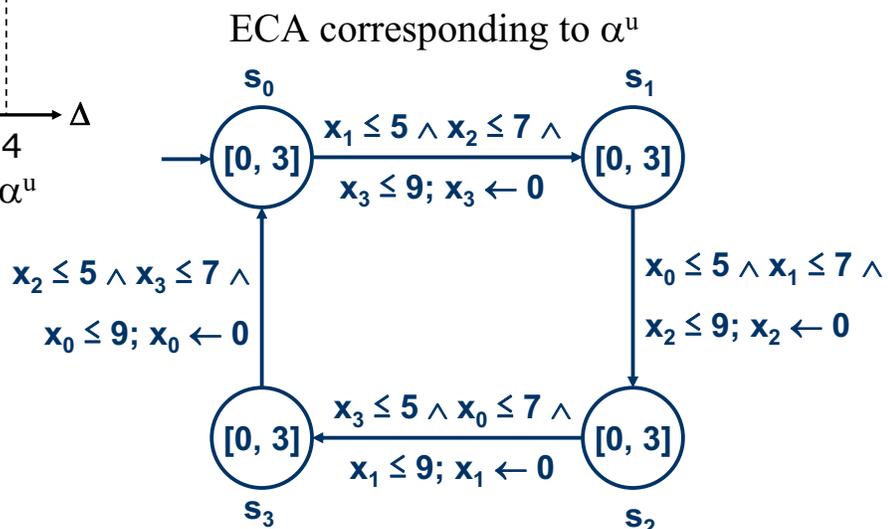
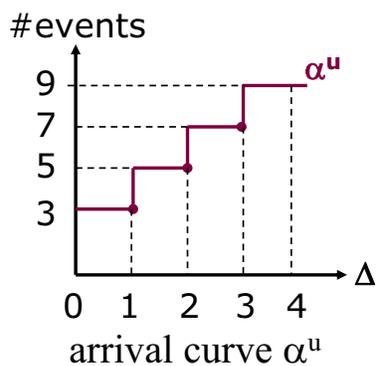
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- ECA describes arrival patterns of the form  $n_1, n_2, \dots, n_k$  with  $n_i$  denoting the number of events arriving during the time  $[i-1, i)$
- The dynamics of an ECA is captured by an associated behavioral automata, whose states are configurations of the form  $(s, V)$ .  $s$  is a state of the ECA and  $V$  is a valuation of the variables
- The basic theory of ECAs follows from the fact that the associated behavioral automata can be quotiented into a finite state automata which accepts the same set of sequences. Arguments are similar to those used for constructing the regional automata for a timed automata

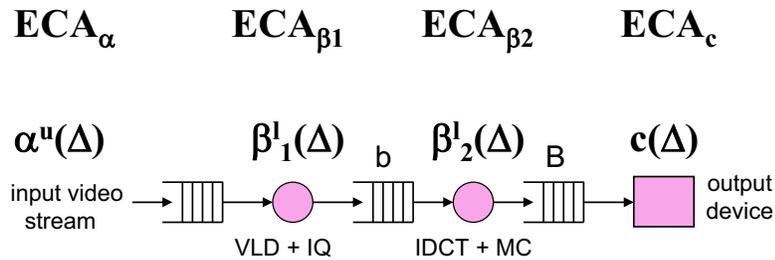
# ECA - Properties

- If  $L(A)$  is the language defined by an ECA  $A$ , then  $L(A)$  is regular
- ECA-definable languages are closed under boolean operations
- It is possible to effectively determine if  $L(A)$  is empty

## ECAs Representing Arrival & Service



# System Modeling using ECAs

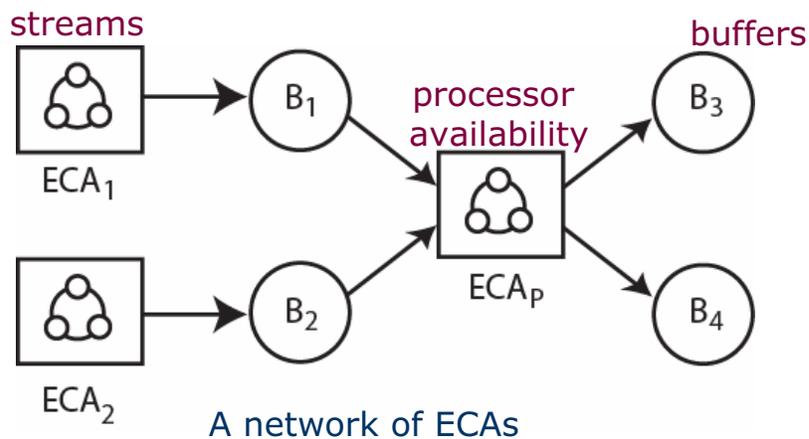


VLD: Variable Length Decoding      IDCT: Inverse Discrete Cosine Transform  
 IQ: Inverse Quantization              MC: Motion Compensation

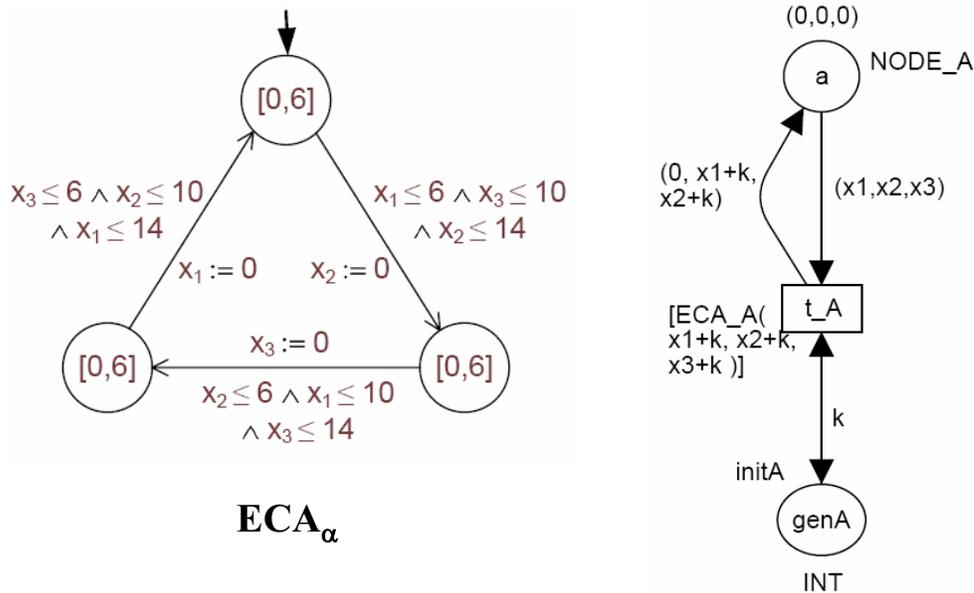
MPEG-2 video decoder mapped onto two processors communicating via FIFO buffers

# Networks of ECAs

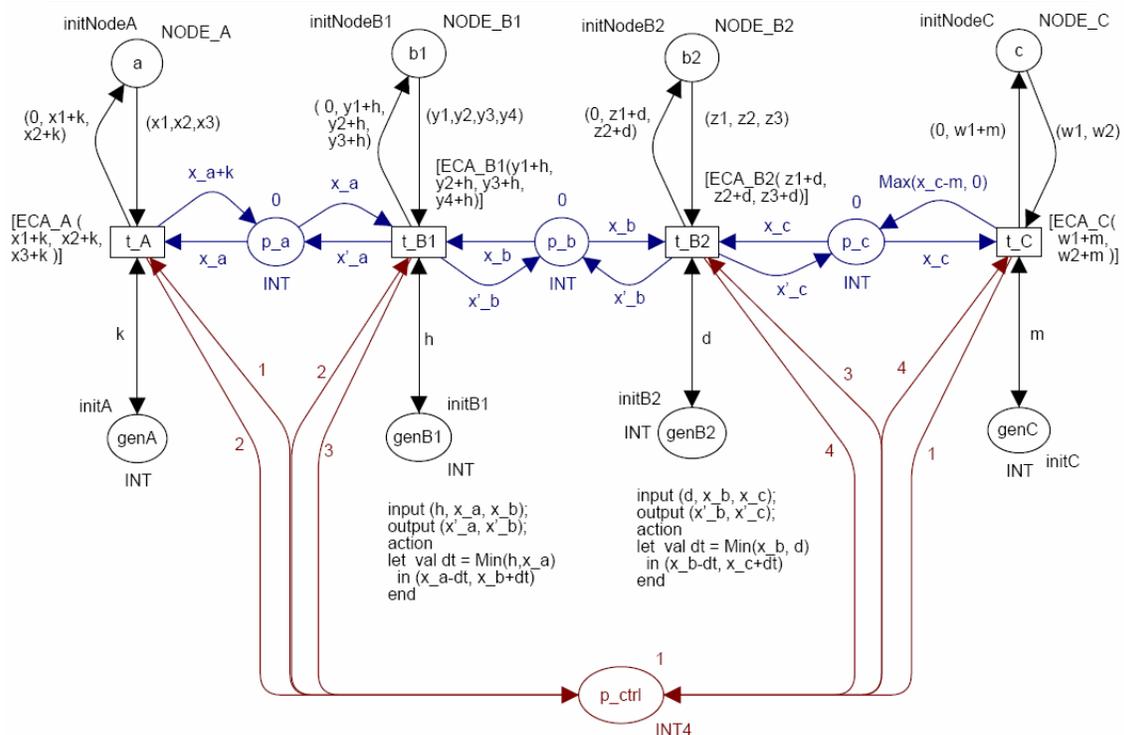
- Each ECA is augmented with
  - I/O buffers
  - Update function: implements scheduling policy



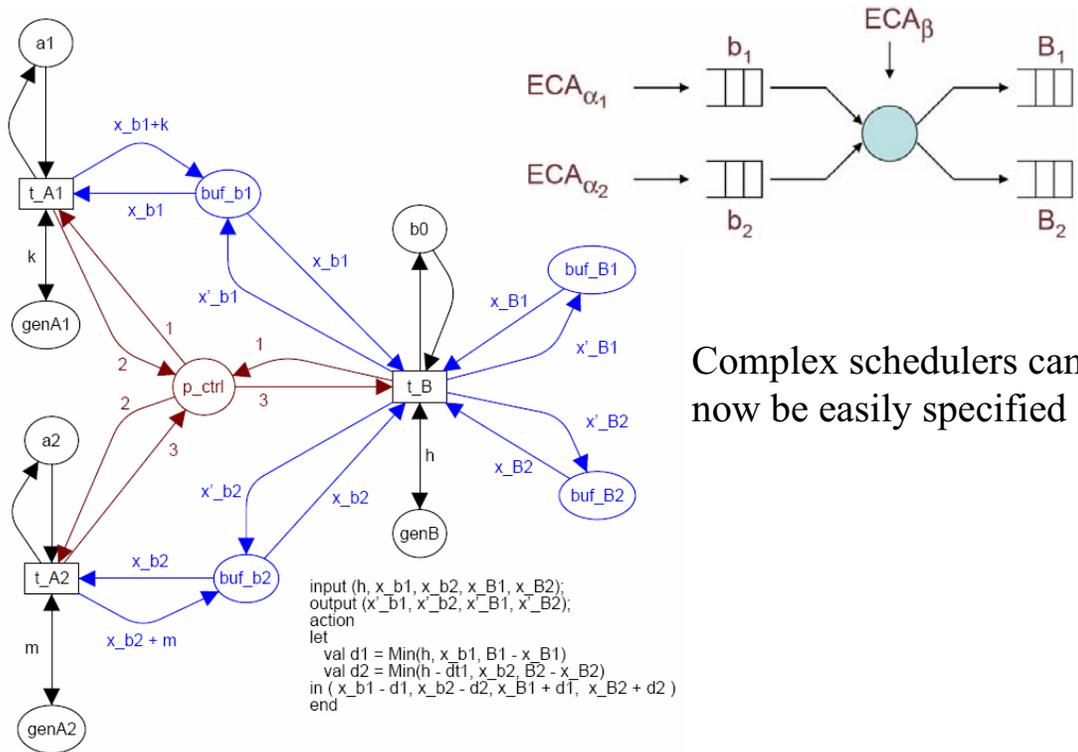
# Encoding ECAs as CPNs



# Networks of ECAs



# Scheduling Multiple Streams



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## RTC vs. ECA

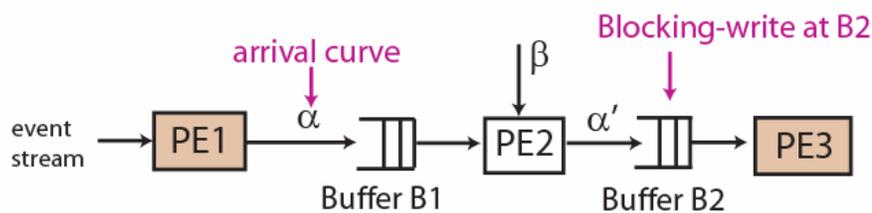
Real-time Calculus	Event Count Automata
<ul style="list-style-type: none"> <li>▪ Functional</li> <li>▪ Cannot model state information</li> <li>▪ Efficient Analysis</li> </ul>	<ul style="list-style-type: none"> <li>▪ State-based</li> <li>▪ Able to model state information naturally</li> <li>▪ Complexity increases as the system grows</li> </ul>

# Integrating Performance Models

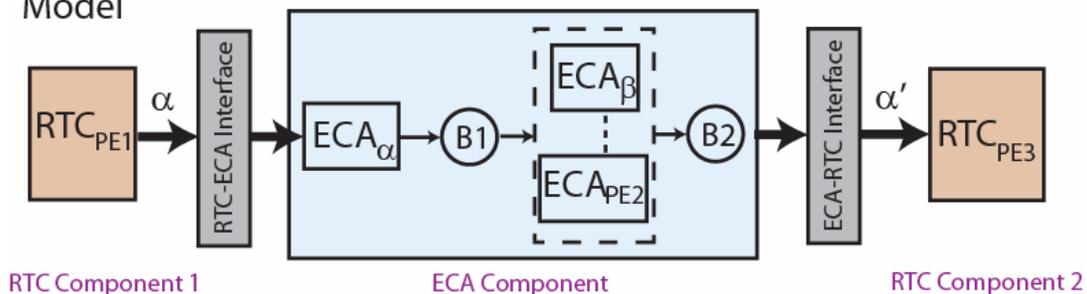
- **RTC + ECA**
  - State-based components: ECA
  - Non state-based components: RTC
  - Using interfaces to connect RTC and ECA components
- Technical Challenge
  - RTC  $\rightarrow$  ECA interface
  - ECA  $\rightarrow$  RTC interface

## RTC+ECA

### System Architecture



### Model

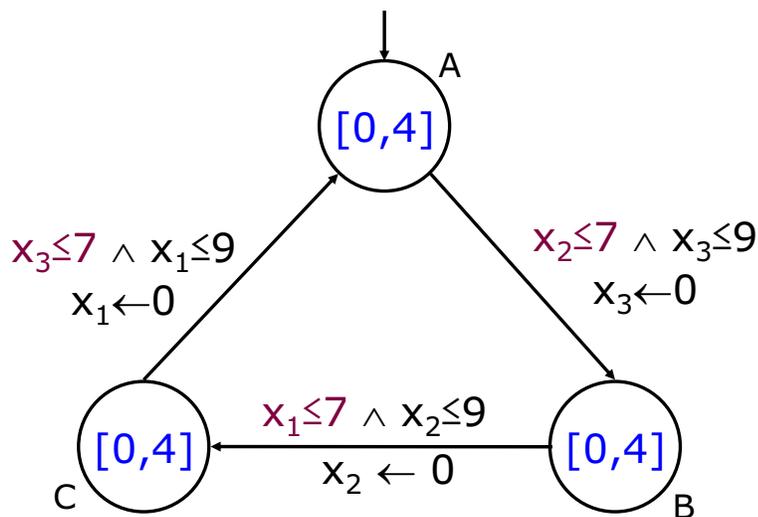


# RTC → ECA Interface

- Converts an arrival curve  $\nu$  into an ECA  $A$ 
  - An arrival pattern satisfies  $\nu$  if and only if it is accepted by  $A$
- Finds a suitable set of count variables  $CV$
- Necessary and sufficient conditions on  $CV$  under which an arrival pattern satisfies  $\nu$
- Appropriate resets of  $CV$  to capture all the time intervals constrained by  $\nu$

## RTC to ECA

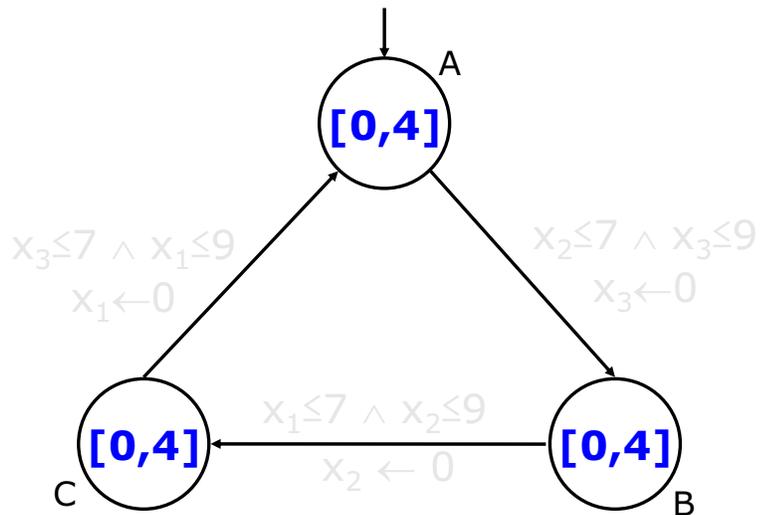
$\Delta$	$\alpha^{\text{upper}}(\Delta)$
1	4
2	7
3	9



$x_1, x_2, x_3$  : count variables of the ECA

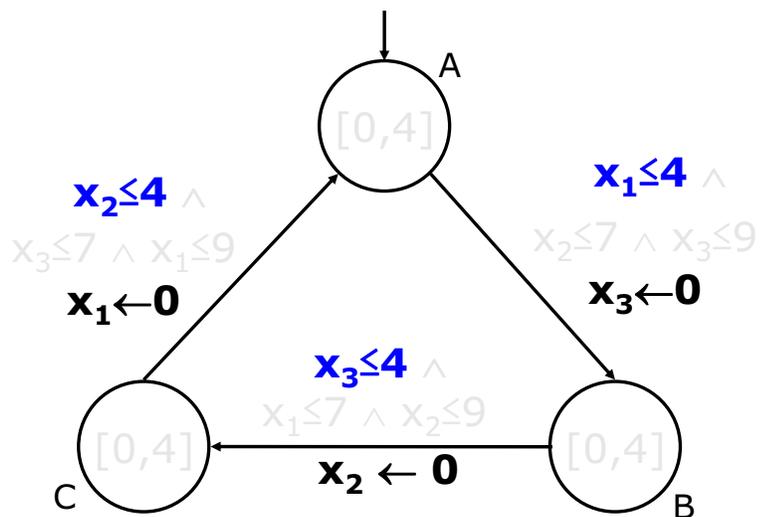
# RTC to ECA

$\Delta$	$\alpha^{\text{upper}}(\Delta)$
<b>1</b>	<b>4</b>
2	7
3	9



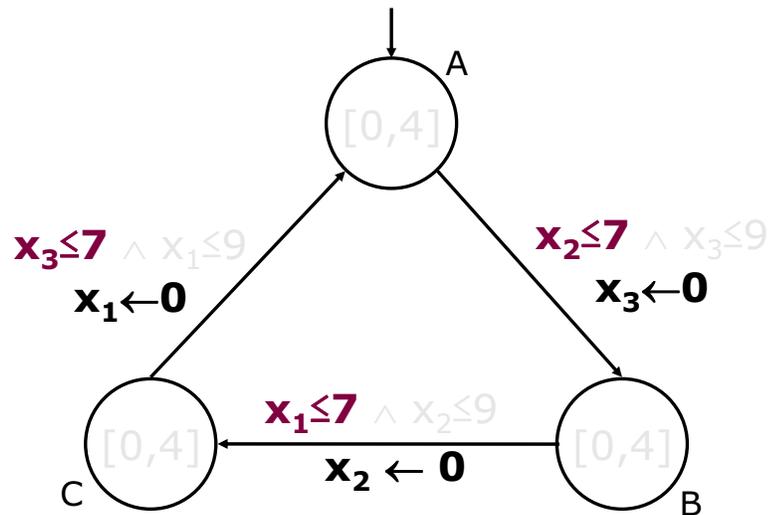
# RTC to ECA

$\Delta$	$\alpha^{\text{upper}}(\Delta)$
<b>1</b>	<b>4</b>
2	7
3	9



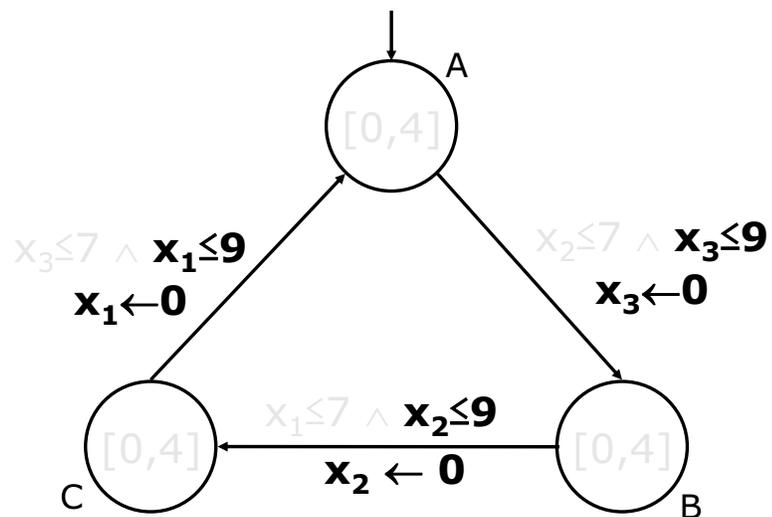
# RTC to ECA

$\Delta$	$\alpha^{\text{upper}}(\Delta)$
1	4
<b>2</b>	<b>7</b>
3	9



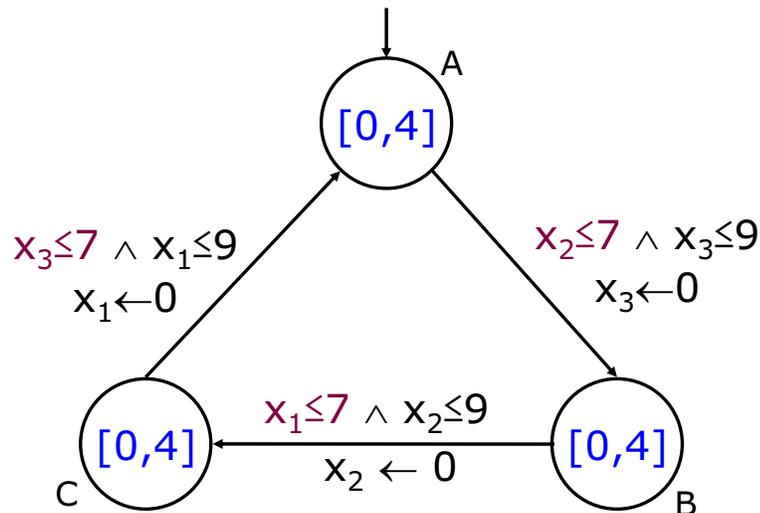
# RTC to ECA

$\Delta$	$\alpha^{\text{upper}}(\Delta)$
1	4
2	7
<b>3</b>	<b>9</b>



## RTC to ECA

$\Delta$	$\alpha^{\text{upper}}(\Delta)$
1	4
2	7
3	9



## ECA $\rightarrow$ RTC Interface

- Given an ECA component, construct the output arrival and remaining service curves
- Idea
  - Time interval : use different window sizes  $\Delta$
  - For each  $\Delta$ , compute  $\alpha^u(\Delta)$  and  $\alpha^l(\Delta)$ 
    - $\alpha^u(\Delta)$  and  $\alpha^l(\Delta)$ : max. and min. number of output events observed in any interval of length  $\Delta$
  - Using automata verification to compute the bounds

# Experimental Evaluation

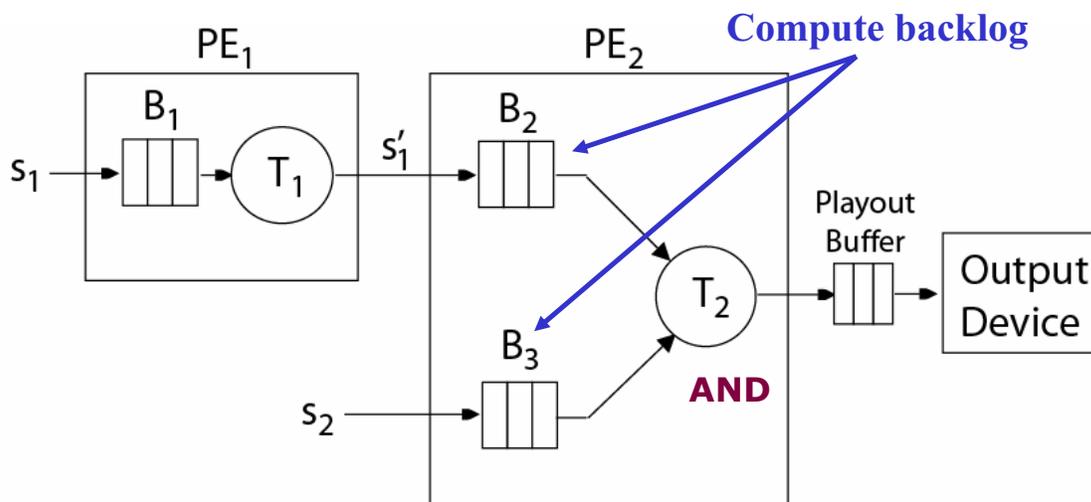
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- Based on:
  - Real-time Calculus Toolbox (for RTC)
    - <http://www.mpa.ethz.ch/Rtctoolbox>
    - Developed at ETH Zürich
  - Symbolic Analysis Laboratory (for ECA)
    - <http://sal.csl.sri.com/>
    - Developed in collaborations of SRI, Stanford and Berkeley

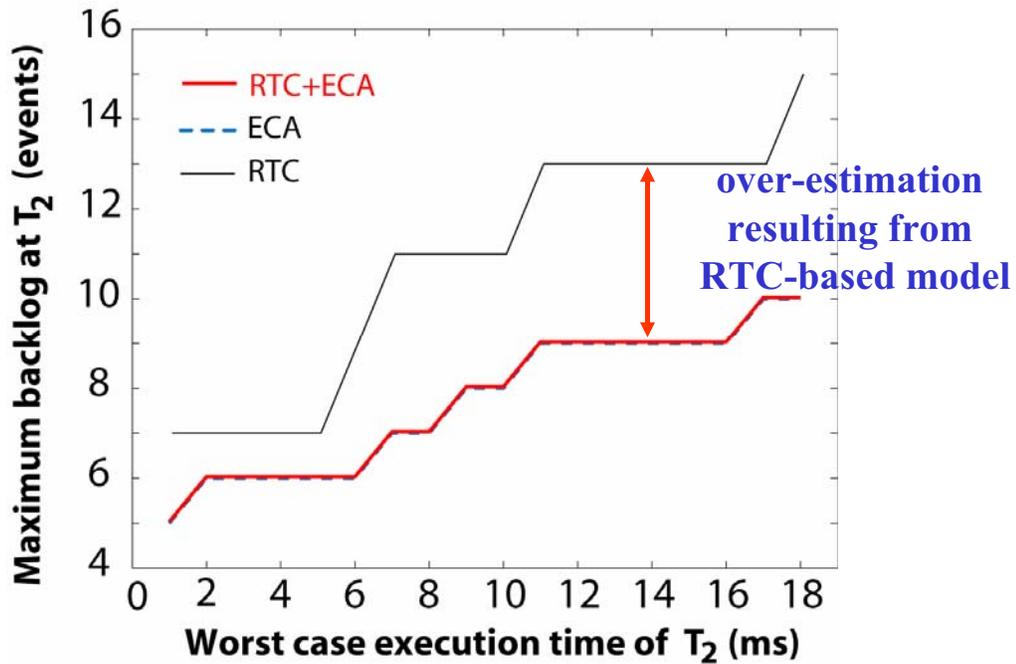
## Exp 1: AND-task Activation

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Combine 2 streams and process them



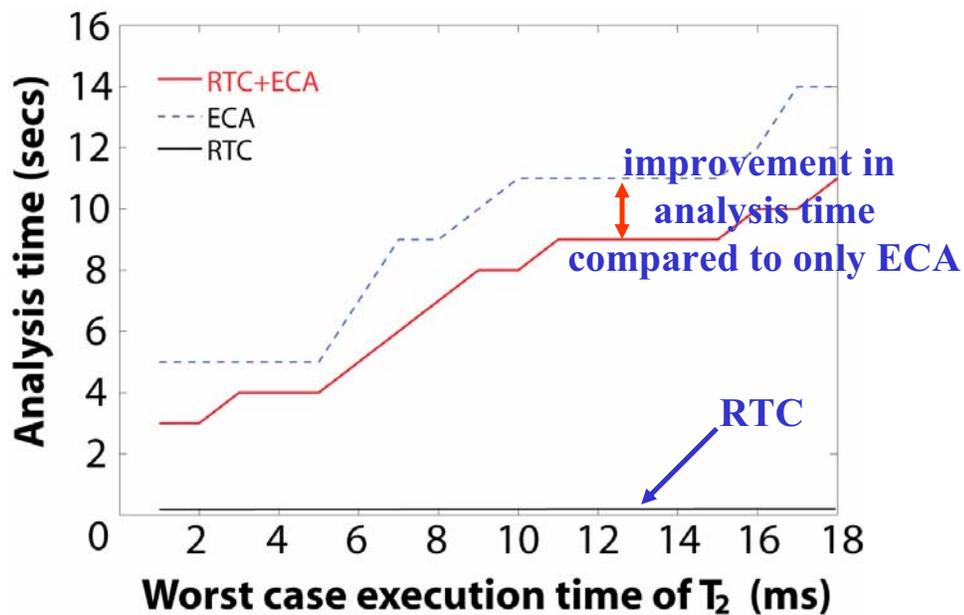
## Exp 1: Backlog Results



DATE 2008, Munich

53

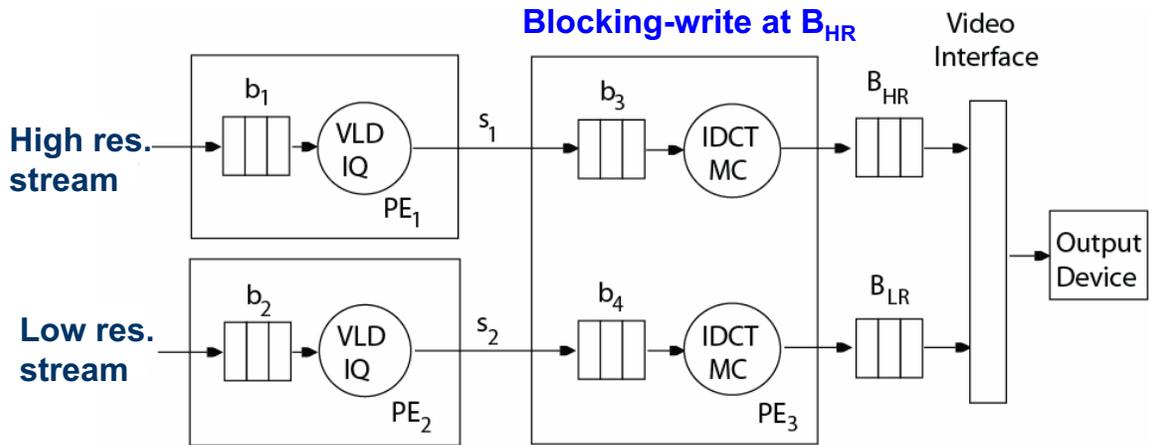
## Exp 1: Analysis Time



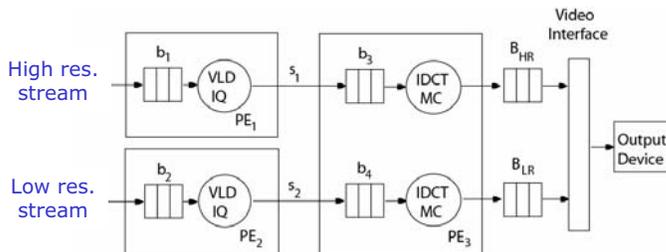
DATE 2008, Munich

54

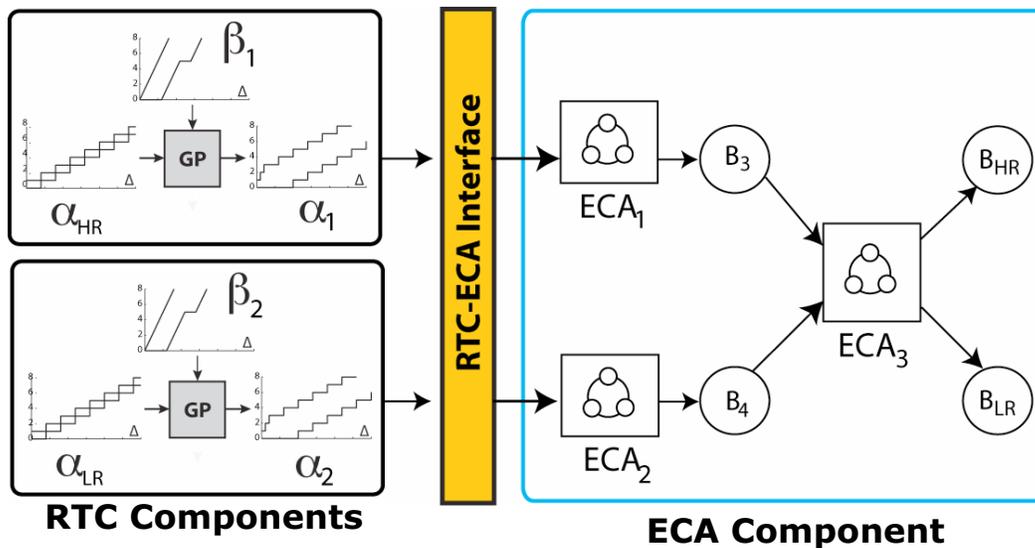
# Exp 2: Picture-in-picture (PiP) Application



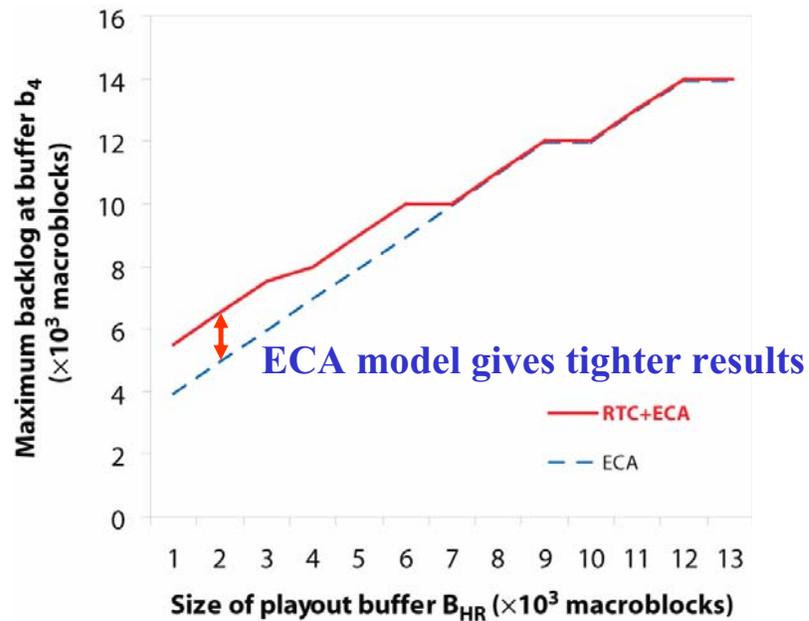
**B, b: buffers, PE: Processing Element**



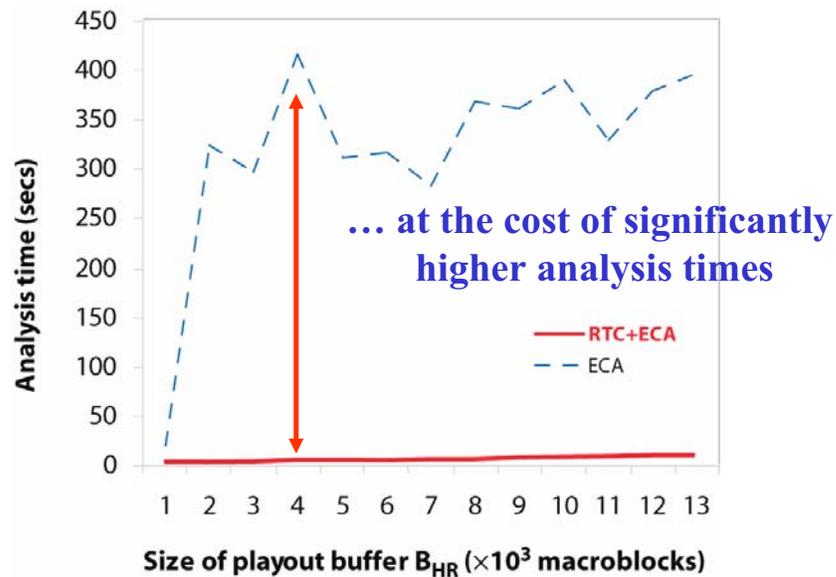
## Modeling the PiP Application



## Exp 2: Backlog Results



## Exp 2: Analysis Times



# Experiments

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- Experiment 1
  - RTC is not accurate
  - ECA is slow
- Experiment 2
  - RTC cannot model
  - ECA is slow
- Both experiments
  - Our proposed method is more accurate than RTC and much more efficient than ECA

# Concluding Remarks

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- MpSoCs are increasingly becoming complex and heterogeneous
  - Single modeling/analysis paradigm might no longer be sufficient
  - Using multiple specification formalisms has been studied before (SPI: A System Model for Heterogeneously Specified Embedded Systems, Ziegenbein *et al.*, TVLSI 2002)
  - However, the use of multiple performance models is relatively new and is open for research

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  - Lothar Thiele, Simon Kuenzli, Ernsto Wandeler and Alexander Maxiaguine from [ETH Zurich](#)

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