



# **Evaluation and Validation**

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#### Numbers denote sequence of chapters

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# How to evaluate designs according to multiple criteria?

Many different criteria are relevant for evaluating designs:

- Average & worst case delay
- power/energy consumption
- thermal behavior
- reliability, safety, security
- cost, size
- weight
- EMC characteristics
- radiation hardness, environmental friendliness, ..

How to compare different designs? (Some designs are "better" than others)



# Real-time calculus (RTC)/ Modular performance analysis (MPA)

Streams of events important: Examples

periodic event stream

periodic event stream with jitter



Thiele et al. (ETHZ): Extended network calculus:

**Arrival curves** describe the maximum and minimum number of events arriving in some time interval  $\Delta$ .



Service curves  $\beta^{u}$  resp.  $\beta^{\ell}$  describe the maximum and minimum service capacity available in some time interval  $\Delta$ 

### Example:







# **RTC/MPA:** Workload characterization

 $\gamma^{u}$  resp.  $\gamma^{\ell}$  describe the maximum and minimum service capacity required as a function of the number *e* of events. Example:



# RTC/MPA: Workload required for incoming stream

Incoming workload

$$\alpha^{u}(\Delta) = \gamma^{u}(\overline{\alpha^{u}}(\Delta))$$
  $\alpha^{l}(\Delta) = \gamma^{l}(\overline{\alpha^{l}}(\Delta))$ 

Upper and lower bounds on the number of events

$$\overline{\beta}^{u}(\Delta) = (\gamma^{l})^{-1} (\beta^{u}(\Delta)) \qquad \overline{\beta}^{l}(\Delta) = (\gamma^{u})^{-1} (\beta^{l}(\Delta))$$





# **RTC/MPA:** System of real time components

Incoming event streams and available capacity are transformed by real-time components:



Theoretical results allow the computation of properties of outgoing streams ©



# **RTC/MPA:** Transformation of arrival and service curves

Resulting arrival curves:

$$\overline{\alpha}^{u} = \min\left(\left\| \overline{\alpha}^{u} \otimes \overline{\beta}^{u} \right\| \overline{\beta}^{u} \right\|, \overline{\beta}^{u}\right)$$
$$\overline{\alpha}^{l} = \min\left(\left\| \overline{\alpha}^{l} \oplus \overline{\beta}^{u} \right\| \otimes \overline{\beta}^{l} \right\|, \overline{\beta}^{l}\right)$$

Remaining service curves:  $\overline{\beta}^{u} = (\overline{\beta}^{u} - \overline{\alpha}^{l}) \oplus 0$ 

$$\overline{\beta}^{l} = \left( \overline{\beta}^{l} - \overline{\alpha}^{u} \right) \overline{\otimes} 0$$

Where:

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

$$(f \oplus g)(t) = \inf_{u \ge 0} \{f(t+u) - g(u)\}$$

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

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- Details of the proofs can be found in relevant references
- Results also include bounds on buffer sizes and on maximum latency.
- Theory has been extended into various directions, e.g. for computing remaining battery capacities





# **Application: In-Car Navigation System**

Car radio with navigation system User interface needs to be responsive Traffic messages (TMC) must be processed in a timely way Several applications may execute concurrently







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### **System Overview**







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### **Use case 1: Change Audio Volume**







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# **Use case 1: Change Audio Volume**



### **Use case 2: Lookup Destination Address**



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### **Use case 2: Lookup Destination Address**



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### **Use case 3: Receive TMC Messages**



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### **Use case 3: Receive TMC Messages**



### **Proposed Architecture Alternatives**



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# Step 1: Environment (Event Steams)

#### **Event Stream Model**

e.g. Address Lookup (1 event / sec)









# **Step 2: Architectural Elements**

#### **Event Stream Model**



Rate Monotonic Scheduling (Pre-emptive fixed priority scheduling):

- Priority 1: Change Volume
- (p=1/32 s)
- Priority 2: Address Lookup
- Priority 3: Receive TMC

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# **Step 4: Performance Model**



# **Step 5: Analysis**



How do the proposed system architectures compare in respect to end-to-end delays?







# Analysis – Design Question 1

End-to-end delays:

100

50

0

100

50

0

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#### How robust is architecture A?

#### Where is the bottleneck of this architecture?









# **Analysis – Design Question 2**

#### TMC delay vs. MMI processor speed:



- Easy to construct models (~ half day)
- Evaluation speed is fast and linear to model complexity (~ 1s per evaluation)
- Needs little information to construct early models (Fits early design cycle very well)
- Even though involved mathematics is very complex, the method is easy to use (Language of engineers)







# How to evaluate designs according to multiple criteria?

Many different criteria are relevant for evaluating designs:

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How to compare different designs? (Some designs are "better" than others)



### Average vs. worst case energy consumption

- The average energy consumption E<sub>AV</sub> is based on the consumption for selected sets of input data (which?)
- The worst case energy consumption  $E_{WC}$  is a safe upper bound on the energy consumption
- The worst case usage pattern for the battery is ≠ from the worst case for the overall energy consumption
- In general, the pattern for worst case energy consumption is ≠ from the worst case thermal pattern



# **Evaluation of energy consumption: Challenges**

- Energy consumption hardly predictable from the source code, due to difficult to predict impact of compiler & linker
- Small variations of the code can lead to large variations of the energy consumption
  - ex. notorious examples



- Example: shifting code in memory by one byte
- Energy consumption must be predicted from executable code (like the WCET)
- The energy consumption might even depend very much on which instance of the hardware is used



- Currents difficult to measure
- In general, accuracy remains a problem
- Combined models
- Models: flexible architecture, less precise

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Measurements: (potentially) precise, fixed





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# Steinke's model



$$E_{total} = E_{cpu\_instr} + E_{cpu\_data} + E_{mem\_instr} + E_{mem\_data}$$

# E.g.: ATMEL board with ARM7TDMI and ext. SRAM



S. Steinke, M. Knauer, L. Wehmeyer, P. Marwedel: An Accurate and Fine Grain Instruction-Level Energy Model Supporting Software Optimizations, Int. Workshop on Power and Timing Modeling, Optimization and Simulation (PATMOS), 2001

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# **Example: Instruction dependent costs in the CPU**

Cost for a sequence of m instructions

$$\begin{split} E_{cpu\_instr} &= \sum MinCostCPU(Opcode_i) + FUCost(Instr_{i-1},Instr_i) + \\ & \alpha_1 * \sum w(Imm_{i,j}) + \beta_1 * \sum h(Imm_{i-1,j},Imm_{i,j}) + \\ & \alpha_2 * \sum w(Reg_{i,k}) + \beta_2 * \sum h(Reg_{i-1,k},Reg_{i,k}) + \\ & \alpha_3 * \sum w(RegVal_{i,k}) + \beta_3 * \sum h(RegVal_{i-1,k},RegVal_{i,k}) + \\ & \alpha_4 * \sum w(IAddr_i) + \beta_4 * \sum h(IAddr_{i-1},IAddr_i) \end{split}$$

- *w*: number of ones;
- *h:* Hamming distance;
- *FUCost*: cost of switching functional units;
- α, **β**: determined through experiments.



# Hamming Distance between adjacent addresses is playing major role





# Energy-efficient execution on graphics processor (GPU)



Energy per frame CPU	3.26 J	5.84 J	10.52 J	Reduced to
Energy per frame GPU	0.93 J	1.56 J	2.76 J	avg 27%

C. Timm, A. Gelenberg, P. Marwedel, F. Weichert: Energy Considerations within the Integration of General Purpose GPUs in Embedded Systems. Intern. Conf. on Advances in Distributed and Parallel Computing, 2010

C. Timm, F. Weichert, P. Marwedel, H. Müller: Design Space Exploration Towards a Realtime and Energy-Aware GPGPU-based Analysis of Biosensor Data. Computer Science - Research and Development, ENA-HPC, 2011

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# **CACTI** model



# **Energy consumption of memories**

#### Example: CACTI / high performance Scratchpad (SRAM):



#### 16 bit read; size in bytes; 65 nm technology

Source: Olivera Jovanovic, TU Dortmund, 2011

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# **Energy consumption of memories (2)**

Example CACTI: Scratchpad (SRAM) vs. DRAM (DDR2):



16 bit read; size in bytes;65 nm for SRAM, 80 nm for DRAM

Source: Olivera Jovanovic, TU Dortmund, 2011

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Complex DRAM models:

- http://www.micron.com/products/support/power-calc
- T. Vogelsang: Understanding the Energy Consumption of Dynamic Random Access Memories, Proceedings of the 2010 43rd Annual IEEE/ACM International Symposium on Microarchitecture, pp. 363—374, http://dx.doi.org/10.1109/MICRO.2010.42





# Steinke's "combined" model

- Measured values for the processor
- Model-based values for memories (validated against existing measurements)







# **Examples of energy models**

- Measurements:
  - Tiwari (1994): Energy consumption within processors
  - Russell, Jacome (1998): Measurements for 2 fixed configurations
  - Simunic (1999): Values from data sheets. Not very precise.
  - Timm: measurements for graphics card
- Models:
  - CACTI [Jouppi, 1996]: Predicted energy consumption of caches
  - Wattch [Brooks, 2000]: Power estimation at the architectural level, without circuit or layout, known to be imprecise
- Combined models
  - Steinke et al., TU Dortmund (2001): mixed model



# Worst case energy consumption via worst case computing time?



Computing the E<sub>WC</sub> using WCET estimations

$$E_{WC} = \int_{0}^{WCET_{EST}} P(t) dt$$

- Tight bounds if P(t) has small variations &  $WCET_{EST}$  is tight
- Little value if P(t) varies too much.



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frequently with fitting

# **Battery models**

- (Chemical) & physical models
   e.g. concentrated solution theory, partial differential eq.s many, frequently unknown parameters (50+); xy hours simulation time
- Empirical models
   Simple equations, inaccurate
  - Peukert's law: lifetime=  $C/I^{\alpha}$ , with empirical  $\alpha$
  - Weibull fit
- Abstract models
  - Electrical circuit models
  - Discrete time model (e.g. in VHDL)
  - Stochastic models (e.g. Markov processes)
- Mixed models
  - e.g. electrical models with physical explanation



# Model proposed by Chen and Rincón-Mora



Source: M. Chen, G. A. Rincón-Mora: Accurate Electrical Battery Model Capable of Predicting Runtime and *I-V* Performance, *IEEE Trans. on Energy Conversion*, 2006, pp. 504

- Full charge capacitor:  $C_{Capacity} = 3600 \cdot Capacity \cdot f_1(cycle) \cdot f_2(Temp)$
- Self-discharge resistor: R<sub>Self-Discharge</sub> (might depend on parameters)
- Current dependency of  $V_{Batt}$ : modeled by  $R_{series} + R_{Transient_S} + R_{Transient_L}$
- $I_{Batt}$  charges and discharges  $C_{Capacity}$
- Voltage controlled voltage source  $V_{0C}$  captures nonlinear dependency between the state of charge and  $V_{0C}$  (measurement can take days)
- *R<sub>Series</sub>*: models immediate voltage drop at load change



# **Battery capacity sufficient?**

#### Question can be solved with adapted real-time calculus



Lipskoch, H., Albers, K. and Slomka, F.: Battery discharge aware energy feasibility analysis, Proceedings of the 4th international Conference on Hardware/Software Codesign and System Synthesis, CODES+ISSS '06, pp. 22-27, 2006.

# Energy models for communication: An Energy Model for Mobile WiMAX Devices

- How does the application data rate influence the energy efficiency?
- What is the impact of very small amounts of data on the efficiency?
- Relationship between submitted power and consumed energy?



# **Traffic Dependent Energy Consumption**



Data Transmission

- Average Power in Idle State: 880 mW
- Channel Quality Reports every 300 ms lead to increased average power of 930 mW
- Transmission is costing significantly increased energy consumption
- Reception is not increasing the power consumption compared with idle state



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Source: Wietfeld et al., 2012 - 49 -

# Modeling the Impact of $\underline{T}_{\underline{x}}$ -Power Variation



- Energy per Bit is constant for low T<sub>x</sub> power (below -25 dBm)
- For higher T<sub>x</sub> power, the consumed energy can be approximated be 2<sup>nd</sup> degree polynomial
- Significant energy savings can be achieved by using as low power as possible

α	β	γ	С(Ψ=35/12)	С(Ψ=32/15)	С(Ψ=29/18)	С(Ψ=26/21)	PTx,min
1.0325e-6	4.6e-5	5.225e-4	1.1084e-3	8.3530e-4	6.916e-4	5.994e-4	-25 dBm





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Source: Wietfeld et al., 2012 - 50 -

# **Modeling the Impact of Different File Sizes**



The Energy Model for different file sizes can be divided into three parts

#### Log Linear Area:

Rapidly decreasing energy consumption per Bit for packet sizes below 20 kByte

#### **Transition Area:**

Transition to constant energy consumption

#### **Saturation Area**

For packet sizes above 900 kByte, collecting more data does not make sense from an energy efficiency perspective



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Source: Wietfeld et al., 2012 - 51 -

# **Validation for Different Devices**



# How to evaluate designs according to multiple criteria?

Many different criteria are relevant for evaluating designs:

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Thermal models becoming increasingly important

- since temperatures become more relevant due to increased performance, and
- since temperatures affect
  - usability and
  - dependability.









# **Thermal conductivity**



**Thermal conductivity**  $\kappa$  reflects the amount of thermal energy per unit of time transferred through a plate made of some material of area *A* and thickness *l* when the temperatures at the opposite sides differ by one temperature unit (e.g. Kelvin)

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# **Examples of thermal conductivity**

Material	Thermal conductivity [W/(m K)]	
Copper	240-401	
Aluminum (95.5%)	236	
Silicon	148	
Wood (perpendicular to fibre)	0.09-0.19	
Concrete	0.08-0.25	
Air (21% oxygen)	0.0262	

http://de.wikipedia.org/wiki/Wärmeleitfähigkeit



# **Thermal conductance & resistance**

Thermal conductance = amount of thermal energy which passes through a plate per unit of time if the temperatures at the two ends of the plate differ by one unit of temperature (e.g. Kelvin).

$$P_{th} = \kappa \frac{\Delta T \cdot A}{l} \qquad (1) \rightarrow \qquad \frac{P_{th}}{\Delta T} = \kappa \frac{A}{l} \qquad (2)$$

The reciprocal of thermal conductance is called thermal resistance R<sub>th</sub>.

$$R_{th} = \frac{\Delta T}{P_{th}} = \frac{l}{\kappa \cdot A} \tag{3}$$



# **Equivalent thermal circuits**

- Thermal resistances add up like electrical resistances
- Thermal modeling mapped to circuit modeling

e.g.: microprocessor:



 $Ground \approx Reference \\ temperature$ 

$$\Delta T = R_{th} \cdot P_{th} \qquad (3)$$

$$R_{th} = R_{th,die} + R_{th,fan} \qquad (4)$$
For  $R_{th,die} = 0.4 \ [W/K],$ 

$$R_{th,fan} = 0.3 \ [W/K],$$

$$P_{th} = 10 \ [W]:$$

$$\Delta T = 7 \ [K],$$

$$\Delta T_{fan} = 3 \ [K]$$

So far, we have just considered the steady state.

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# **Dynamic thermal properties**

In general, transients and thermal capacity to be considered:  $C_{th} = m \cdot c$ 

where  $C_{th}$ : thermal capacity, *m*: mass, *c*: specific heat The Networks comprising resistances and capacities



#### Extra voltage source can make reference temperature explicit

http://www.infineon.com/dgdl/smdpack.PDF?folderId=db3a304412b407950112b417b3e623f4&fileId=db3a304412b407950112b417b42923f5

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# Equivalences

Electrical model		Thermal model	
Current	Ι	Thermal flow, flow of "power"	$P_{th} = \dot{Q}$
Total charge	$Q = \int I dt$	Thermal energy	$E_{th} = \int P_{th} dt$
Resistance	R	Thermal resistance	R <sub>th</sub>
Potential	φ	Temperature	Т
Voltage = potential difference	$U=\Delta \varphi$	Temperature difference	$\Delta T$
Capacitance	C	Thermal capacitance	C <sub>th</sub>
Ohm's law	U = R I	$\Delta$ Temperature at $R_{th}$	$\Delta T = R_{th} \cdot P_{th}$





# **Examples of thermal resistance of P-TO263-7-3**

Component	Value & Dimension
Thermal resistance of chip	0.48 [K/W]
Thermal time constant of chip	≈1.5 ms
Thermal capacity of chip	≈3 [mWs/K]
Thermal resistance of heat slug	0.24 [K/W]
Thermal capacity of heat slug	310 [mWs/K]
Thermal time constant of heat slug	70 [ms]



http://www.infineon.com/dgdl/smdpack.PDF?folderId=db3a304412b407950112b417b3e623f4&fileId=db3a304412b407950112b417b42923f5

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# Hotspot – A popular thermal simulator for processors

- Localized heating much faster than chip-wide (millisec time scale)
- Chip-wide treatment is inaccurate (neglects hot spots)
- Temperature is sensitive to chip layout (floorplan)
- Fine-grained, dynamic model of temperature
- Authors say: Validated against FEM models



(2D model, 2.5 D exists)

http://lava.cs.virginia.edu/HotSpot/documentation.htm Including PowerPoint slides from ISCA 2003





# Results of simulations based on thermal models (1)

Encapsulated cryptographic coprocessor:



Plane Location Y = 76.75 mm

Source: http://www.coolingzone.com/Guest/News/ NL\_JUN\_2001/Campi/Jun\_Campi\_2001.html

eedt II / n new

FIPS 4



# Results of simulations based on thermal models (2)

#### **Microprocessor**



Source: http://www.flotherm.com/ applications/app141/hot\_chip.pdf



# Summary

- Thiele's real-time calculus (RTC)/MPA
  - Using bounds on the number of events in input streams
  - Using bounds on available processing capability
  - Derives bounds on the number of events in output streams
  - Derives bound on remaining processing capability, buffer sizes, ...
  - Examples demonstrate design procedure based on RTC
- Energy and power consumption
  - Measurements
  - Models (with calibration)
  - Mixed approaches
  - Energy for computation, storage and communication
- Thermal behavior
  - Mapping to thermal circuit model



# Reserve





