#### **Energy-Aware Computing Systems**

Energiebewusste Rechensysteme

IX. Energy-Aware Programming

Timo Hönig

2018-12-19











Summary

Agenda

Preface and Terminology

System Activities and Energy Demand Cross-Layer Considerations

Retrospective vs. Prospective

**Energy-Aware Programming** 

HEAL, ROAM Paper Discussion

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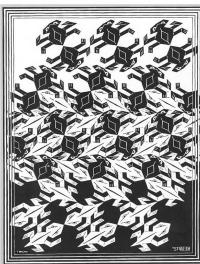
#### **Energy-Aware Programming**

#### motivation

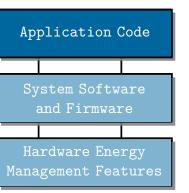
- knowledge transfer:  $development \rightarrow execution phase$
- reduction of work to the necessary minimum
- carry out the remaining work in the most efficient way

#### operational goals

- reduce guesswork by lower system levels (i.e., system software, firmware, and hardware)
- interweave static aspects (→ ahead of run time) with dynamic aspects  $(\rightarrow$  at run time)



# **Cross-Layer Considerations**



- compiler optimization (e.g., loop optimizations, aligned RAM access)
- tracing and profiling Tools (e.g., PowerTOP)
- energy management stack
- latency hiding, race/crawl to sleep
- dynamic voltage and frequency scaling (DVFS)
- sleep states (e.g., CPU C-states, device-specific power saving features)





#### Retrospective vs. Prospective: Analysis

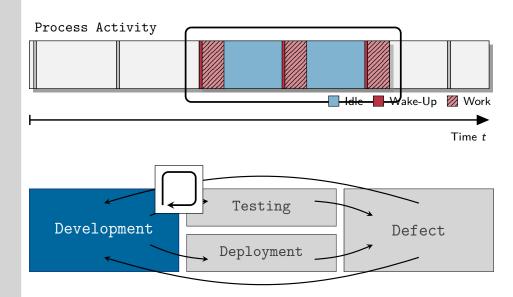
- statistics at process level (e.g., PowerTOP), unit of measurement is wake-ups per second
- wake-ups cause the CPU to return from C-state, subsequent activities (e.g., I/O) are likely to follow
- lacktriangle less wake-ups ightarrow lower energy demand

# User Activity User Activity Idle Wake-Up Work Time t

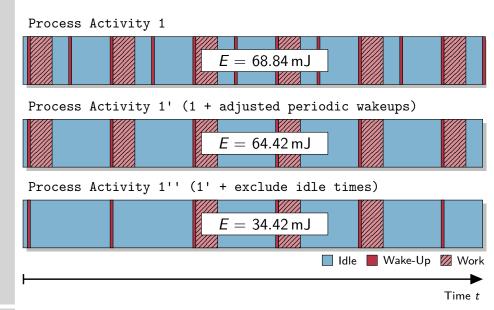


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#### Retrospective vs. Prospective: Forward-Looking



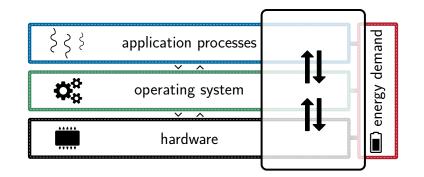
# Retrospective vs. Prospective: Revisions and Impact





# **Energy-Aware Programming**

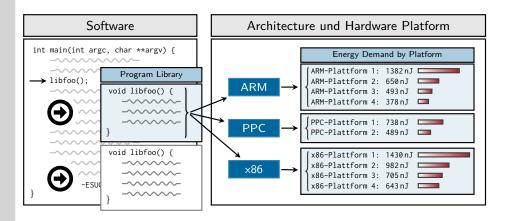
- proactive energy-aware computing
  - cross-layer und cross-phase (positioning and momentum)
  - focus: single-chip computing systems and HPC
- holistic analysis and evaluation of software components with regard to their impact on the energy demand of the systems







# **HEAL**: Energy-Aware Programming



- making energy demand estimates at the function level available during development
- basis for energy-aware programming decisions



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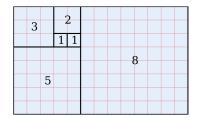
#### HEAL: Program Example Fibonacci Sequence

#### Program:

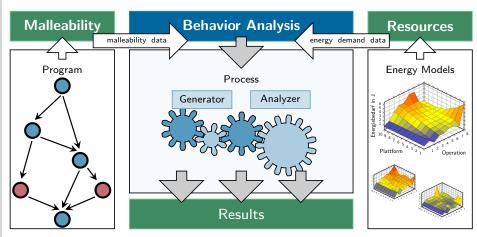
# modes: # #	(l)ookup, static (c)alculate, dynamic (m)emoisation, dynam
<pre>def main():</pre>	
	sys.argv[1]
if mod	le == 'l':
	o_lookup(fnum)
elif mode == 'c':	
fil	o_calc(fnum) 🔇
	node == 'm':
fil	o_calc_mem(fnum) 🔇
ifname	e == "main":

#### HEAL:

- 1. path exploration (argv[1]: symbolic)
- 2. generate program with concrete input
  - z.B. argv[1]: 'c', fnum: 42
  - 3. program execution and evaluation
    - $\rightarrow$  energy demand estimate



#### **HEAL**: Architecture and Implementation



- determine malleability by program analysis
- behavioral analysis with process execution and evaluation
- resource-demand analysis using energy models



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# HEAL: Results and Open Questions

alleability Behavior A

Resources

- $\bigcirc$  energy demand estimates deviate on average by less than  $9.1\,\%$  compared to energy measurements
- the evaluation shows that the energy demand of functionally identical processes deviate up to 3.9 times



10 11 12

13 14 15

16

17

main()

# **HEAL**: Results and Open Questions

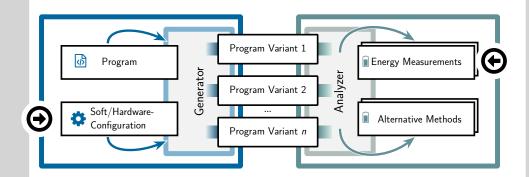
- comparison of (functionally identical) programs as to their different non-functional properties
- energy-demand analysis tightly integrated with the development process of software

T. Hönig et al.: SEEP: Exploiting Symbolic Execution for Energy-Aware Programming ACM SIGOPS Operating Systems Review Vol. 45, No. 3, 2012. Best of HotPower'11

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# ROAM: Program Variant Generator and Analysis



- generate program variants: programs with different software/hardware configurations
- energy measurements with a measuring circuit which is based on a current mirror for determining the energy demand

# HEAL: Results and Open Questions

★ missing and inaccurate energy models for hardware components are the rule

★ unused potential to further reduce energy demand by pre-analysis of runtime energy-saving mechanisms

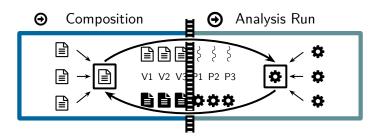


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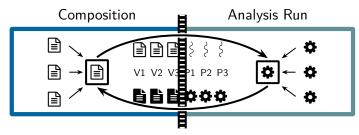
# ROAM: Architecture and Implementation



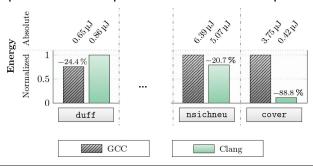
- composition: static preparation for testing
  - heterogeneous hardware settings (z. B. energy saving features)
  - different software settings (z. B. compiler)
- analysis run: dynamic evaluation
  - execution of program variants on different hardware platforms
  - determination of execution time and energy demand by measurement



#### ROAM: Experiments and Results



First experiment<sup>1</sup>: comparison of interface-compatible compilers

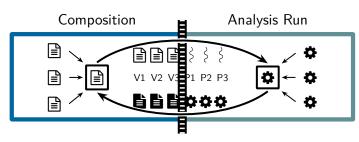


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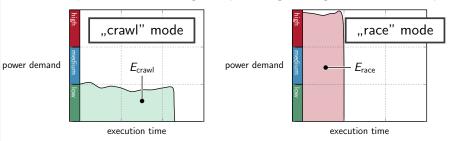
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#### ROAM: Experiments and Results



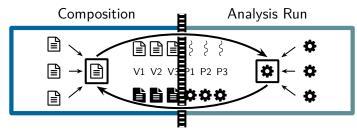
Second experiment<sup>2</sup>: scaling of operating voltage and clock frequency





 $^2$ Software: GNU GCC 4.8, Hardware: ARM Cortex-M0+ (Kinetis KL02, RUN/VLPR)

#### ROAM: Experiments and Results



First experiment<sup>1</sup>: comparison of interface-compatible compilers

- GCC vs. Clang in 80 % of the cases, GCC generates more energy-efficient program variants (up to a quarter lower energy demand)
  - one program variant of Clang is approx. 10 x more energy-efficient than the corresponding variant of GCC
- energy vs. time  $\blacksquare$  <u>no</u> causal relationship between process energy demand and execution time in 10 % of the program analyses

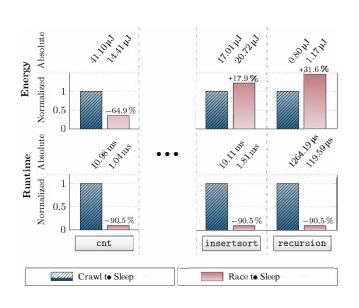


 $^1$ Software: GNU GCC 4.8, LLVM Clang 3.4, Hardware: ARM Cortex-M0+ (Kinetis KL02)

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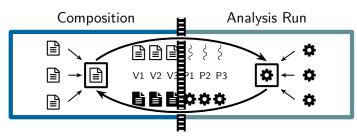
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#### ROAM: Experiments and Results





#### ROAM: Experiments and Results



Second experiment<sup>2</sup>: scaling of operating voltage and clock frequency

race vs. craw ■ "race" mode is commonly preferred to maximize idle time ( $\rightarrow$  exploit sleep modes)

> expected increase in performance occurs in all test cases (i.e., shortening of the execution time)

energy vs. time however, no causal relationship between process energy demand and execution time in 20% of the program analyses

<sup>2</sup>Software: GNU GCC 4.8, Hardware: ARM Cortex-M0+ (Kinetis KL02, RUN/VLPR)

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#### **ROAM:** Results

onfiguration settings made by ROAM reduce hardware energy demand by between 18 % and 65 %

**1** choosing the right compiler infrastructure can reduce the energy demand by a factor of 10

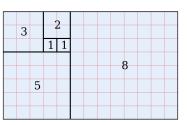
# ROAM: Program Example Fibonacci Sequence (II)

#### Program:

```
# modes: (l)ookup, static
           (c)alculate, dynamic
           (m)emoisation, dynamic
   def main():
      hwop = roam_fetch_hwops()
      mode = sys.argv[1]
      fnum = 42
      sw_hardware_mode(hwop);
11
      if mode == 'l':
12
        fib_lookup(fnum)
      elif mode == 'c':
                     fib calc(fnum)
14
      16
        fib_calc_mem(fnum)
      if __name__ == "__main__":
      main()
```

#### ROAM:

- 1. generate software and hardware settings to be used
- 2. generate program variants
- 3. process execution and evaluation
  - → energy demand measurements
- → results evaluation.





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#### **ROAM:** Results

USENIX TRIOS '14

✓ pre-analysis generates necessary a priori knowledge for suitable hardware settings at process execution time

energy measurement during analysis addresses unavailability of energy models

T. Hönig et al.: Proactive Energy-Aware Programming with PEEK USENIX TRIOS '14





TOTAL TOTAL

T. Hönig et al.: Proactive Energy-Aware Programming with PEEK

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Paper Discussion

Summary



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# Subject Matter

- energy-aware programming connects static (ahead of run time) with dynamic (at run time) analysis
- use cross-layer considerations to reduce energy demand
- pinpoint relevant program code sections for extended analysis and manual labor
- reading list for Lecture 10:
  - ► X. Fan et al.

Power provisioning for a warehouse-sized computer Proceedings of the 34th International Symposium on Computer architecture (ISCA'07), 2007.



- paper discussion
  - ▶ R. Pereira et al.

Energy efficiency across programming languages: how do energy, time, and memory relate?

Proceedings of the 10th ACM SIGPLAN International Conference on Software Language Engineering (SLE'17), 2017.



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#### Reference List I

- [1] HÖNIG, T.; EIBEL, C.; KAPITZA, R.; SCHRÖDER-PREIKSCHAT, W.: SEEP: exploiting symbolic execution for energy-aware programming. In: Proceedings of the 2011 Workshop on Power-Aware Computing and Systems (HotPower '11) ACM, 2011, S. 17–22. – Best of HotPower 2011 Award.
- [2] HÖNIG, T.; JANKER, H.; EIBEL, C.; MIHELIC, O.; KAPITZA, R.; SCHRÖDER-PREIKSCHAT, W.: Proactive Energy-Aware Programming with PEEK. In: Proceedings of the 2014 Conference on Timely Results in Operating Systems (TRIOS '14) USENIX, 2014, S. 1–14



