

# Aware Silicon

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## Acknowledgment

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# Outline

Motivation

Architecture for Awareness

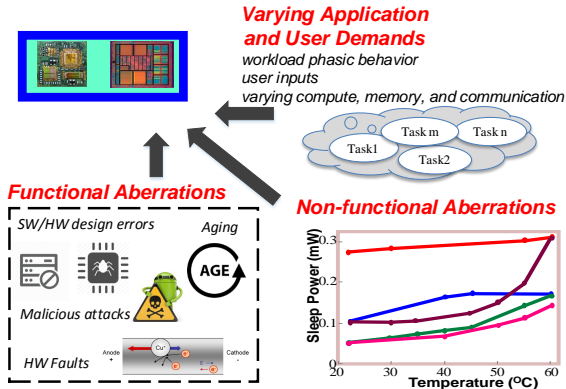
Comprehensive Observation

Goal Management

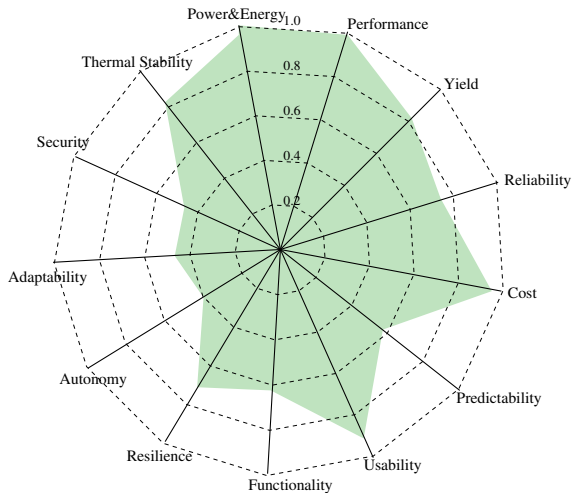
Conclusion

# The Problem

- ▶ Large number of resources
- ▶ Many tight constraints
- ▶ Varying application demands, both within and between applications;
- ▶ Functional Aberrations:
  - ▶ Design errors or omissions;
  - ▶ Malicious attacks;
  - ▶ Aging;
  - ▶ Soft errors;
- ▶ Non-functional Aberrations:
  - ▶ Performance;
  - ▶ Power consumption;

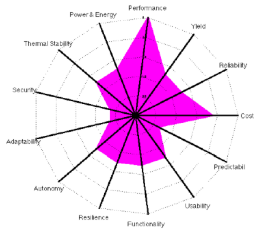


# The SoC Radar

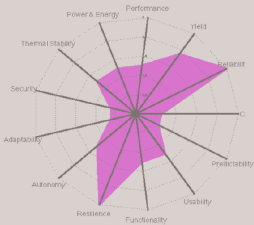


Santanu Sarma et al. "On-Chip Self-Awareness Using Cyberphysical-Systems-On-Chip (CPSoC)". In: *Proceedings of the 12th International Conference on Hardware/Software Codesign and System Synthesis (CODES+ISSS)*. New Delhi, India, Oct. 2014

# The SoC Radar

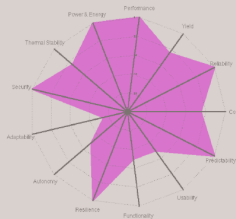


Performance Driven

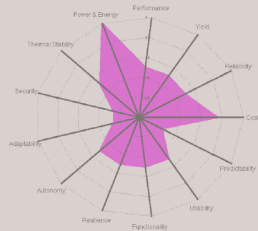


Reliability Driven

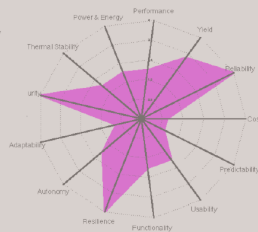
Reality



QoS Combination



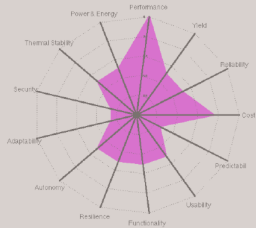
Energy/Power Driven



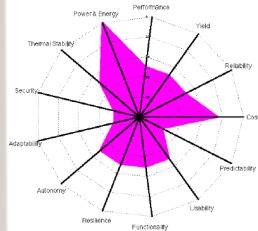
Security Driven

# The SoC Radar

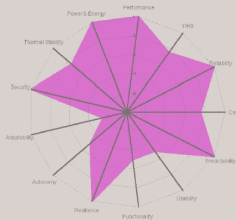
Reality



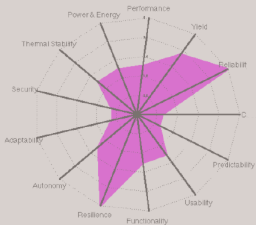
Performance Driven



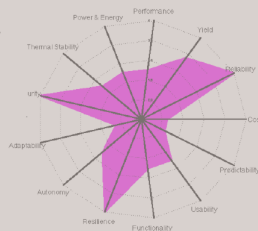
Energy/Power Driven



QoS Combination



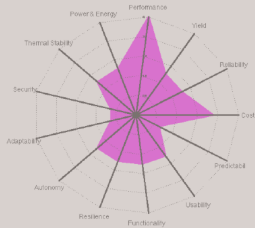
Reliability Driven



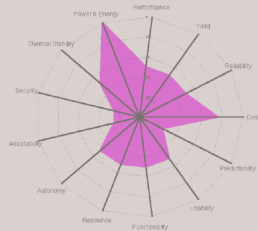
Security Driven

# The SoC Radar

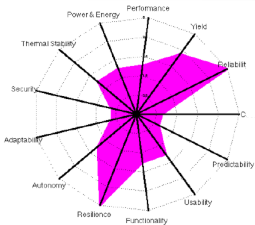
Reality



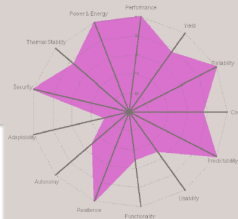
Performance Driven



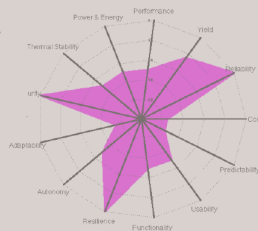
Energy/Power Driven



Reliability Driven



QoS Combination

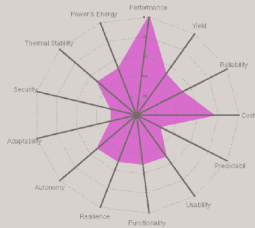


Security Driven

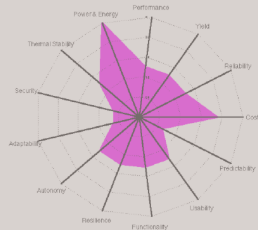


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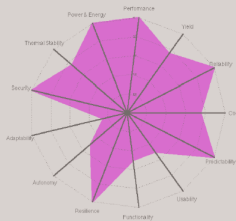
Reality



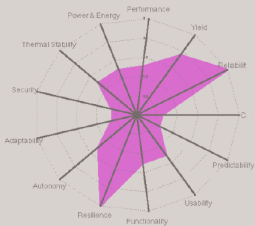
Performance Driven



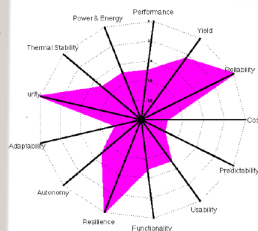
Energy/Power Driven



QoS Combination



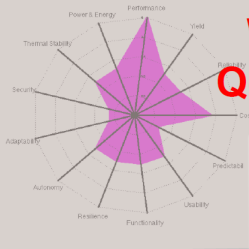
Reliability Driven



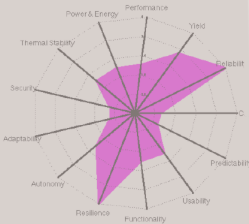
Security Driven

# The SoC Radar

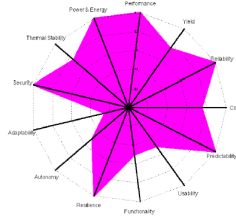
## What we want: QoS Combination



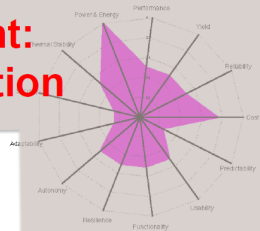
Performance Driven



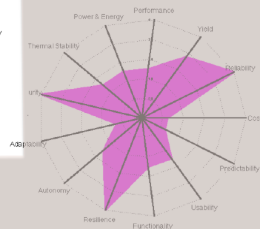
Reliability Driven



QoS Combination

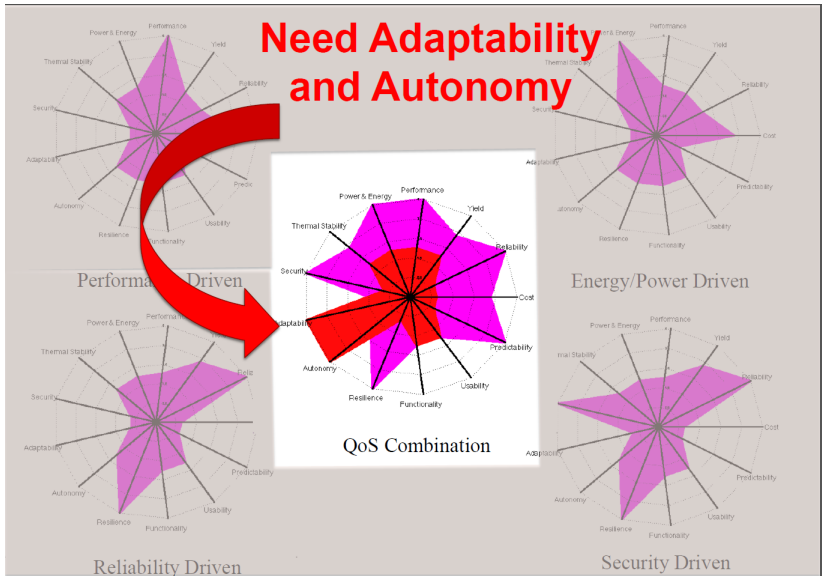


Energy/Power Driven



Security Driven

# The SoC Radar

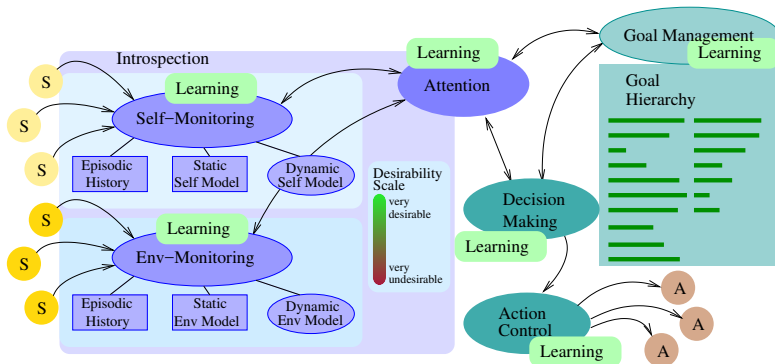


# Autonomy and Adaptivity

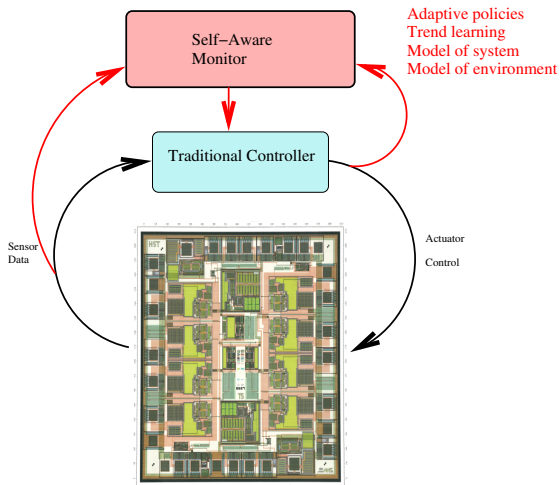
**Autonomy** is the ability to operate independently, without external control.

**Adaptivity** is the ability to effect run-time changes and handle unexpected events.

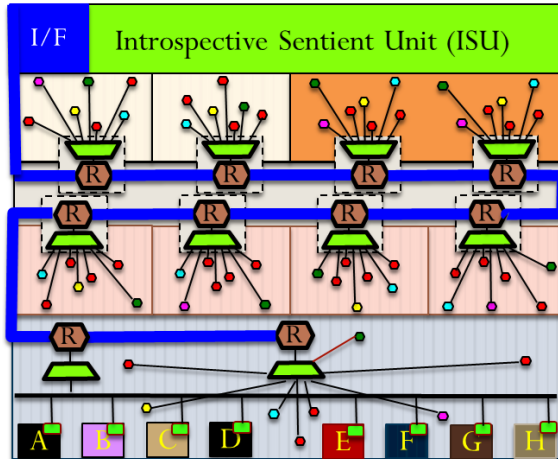
# Self-Awareness Architecture



# Cyber-Physical SoC

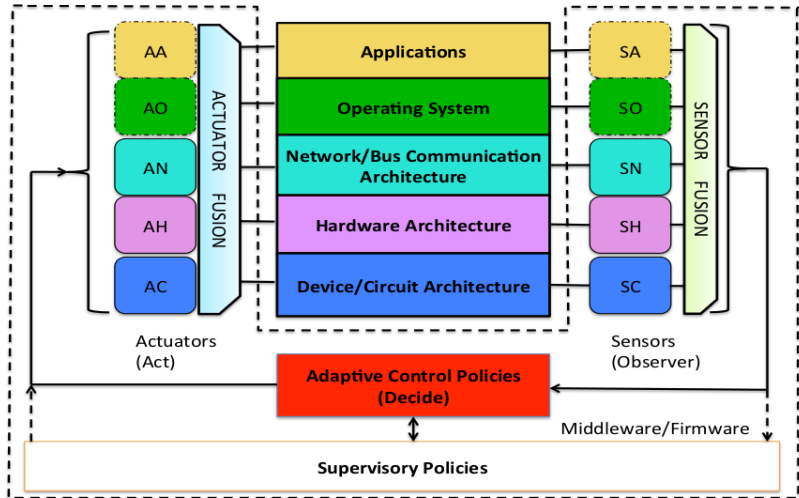


# CPSoC - A Sensor Rich SoC Platform



Santanu Sarma et al. "CyberPhysical-System-On-Chip (CPSoC): A Self-Aware MPSoC Paradigm with Cross-Layer Virtual Sensing and Actuation". In: *Proceedings of the Design, Automation and Test in Europe Conference and Exhibition (DATE)*. Grenoble, France, Mar. 2015

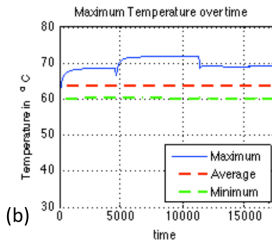
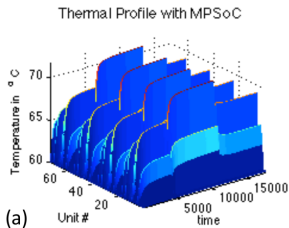
# CPSoC - A Sensor Rich SoC Platform



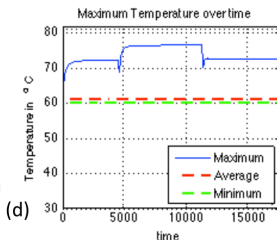
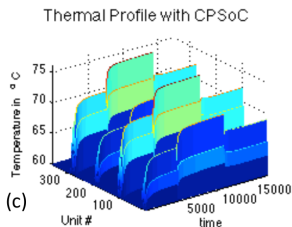
Nikil Dutt, Axel Jantsch, and Santanu Sarma. "Self-Aware Cyber-Physical Systems-on-Chip". In: *Proceedings of the International Conference for Computer Aided Design*. invited. Austin, Texas, USA, Nov. 2015



# Thermal-Aware Performance

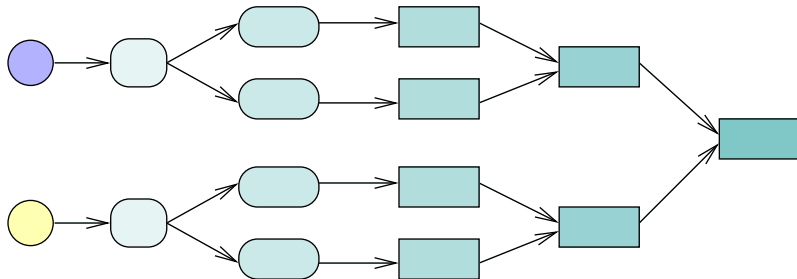


Throughput improvement by 70%-300% for same power and temperature.

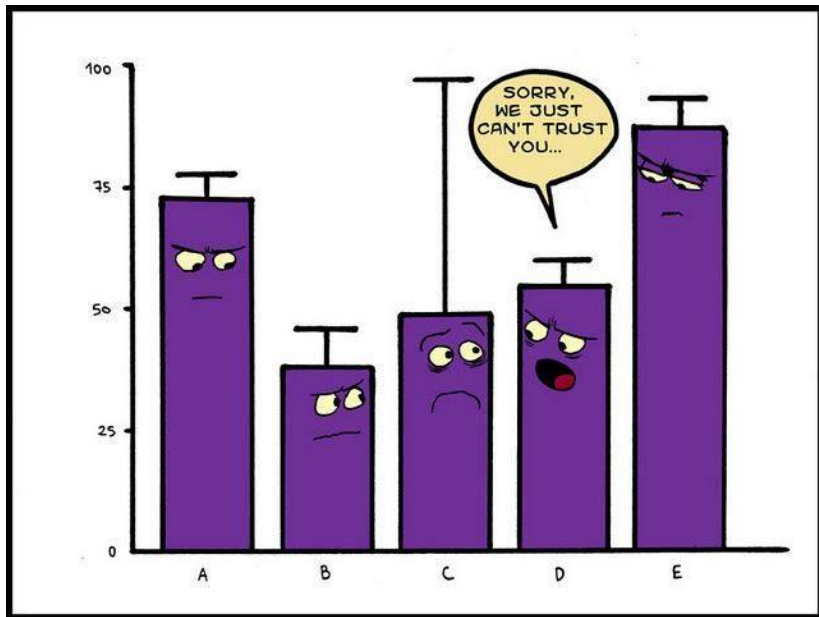


Benefit is due to accurate and fine-grain measurement and tight tracking.

# Observation Pipeline



# Data and Meta-Data



# Data and Meta-Data

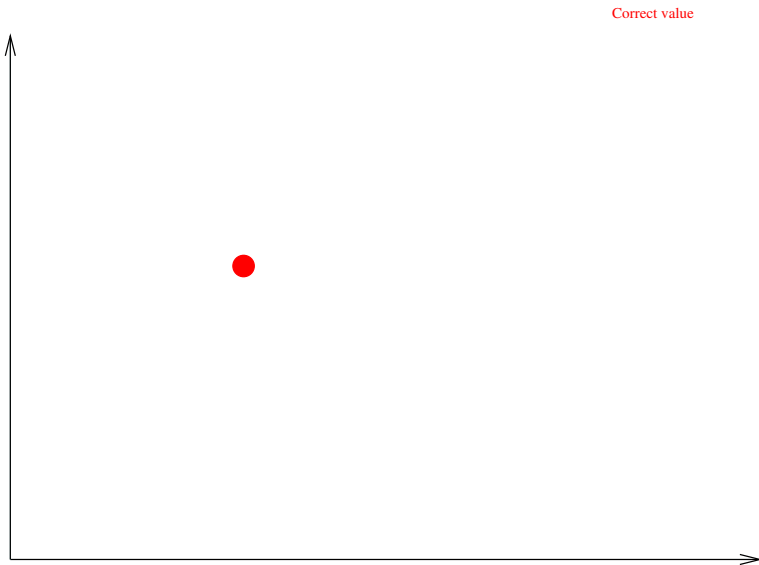
**Accuracy** Systematic errors, a measure of statistical bias.

**Precision** Random errors, a measure of statistical variability.

**Data Reliability** The extent to which a measuring procedure yields the same results on repeated trials.

**Relevance** The quality of being important for the matter at hand.

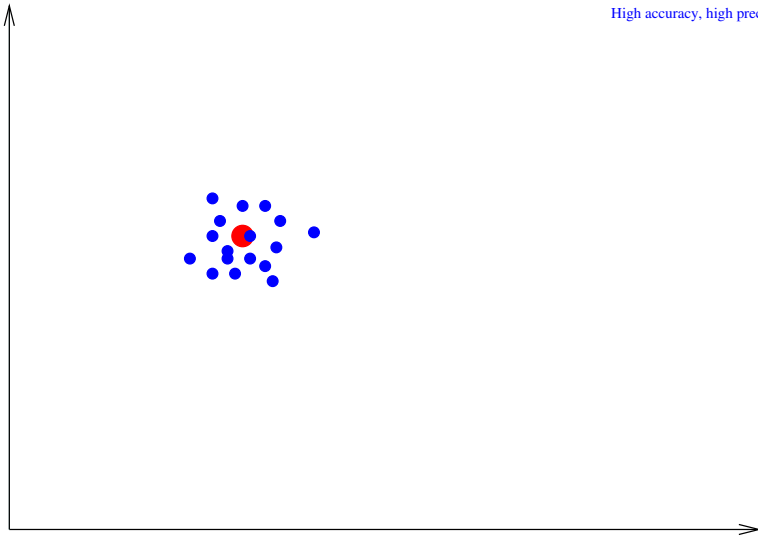
# Accuracy and Precision



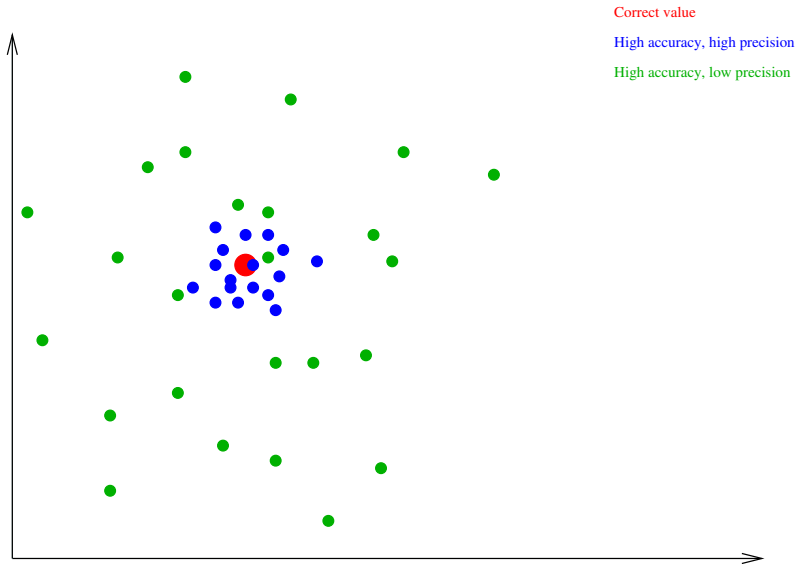
# Accuracy and Precision

Correct value

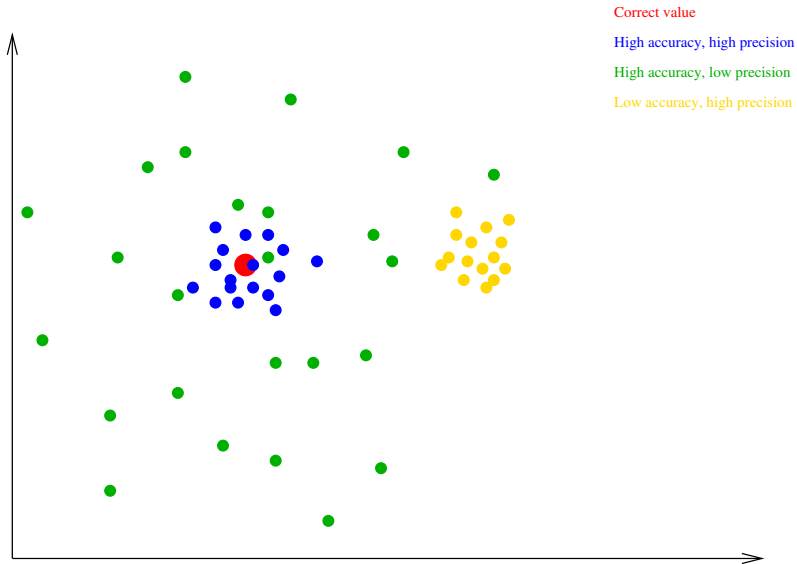
High accuracy, high precision



# Accuracy and Precision

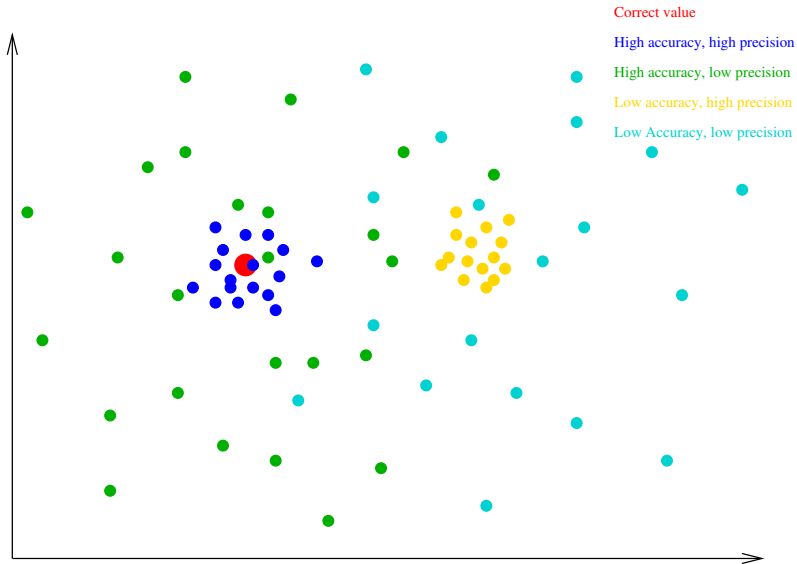


# Accuracy and Precision

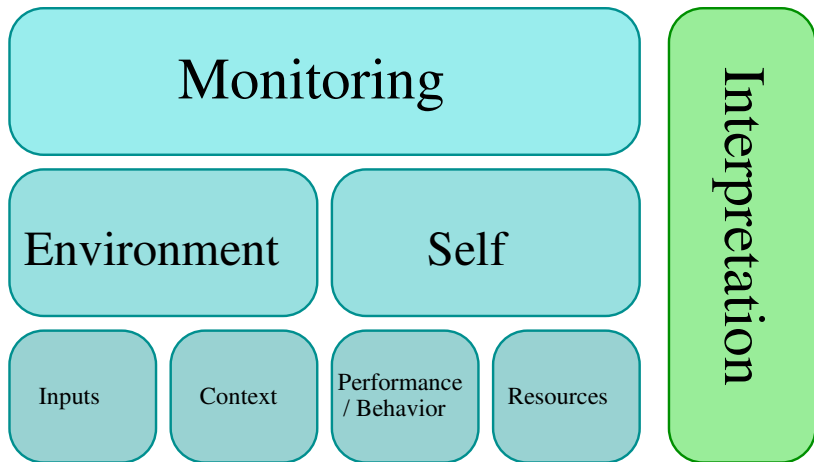




# Accuracy and Precision

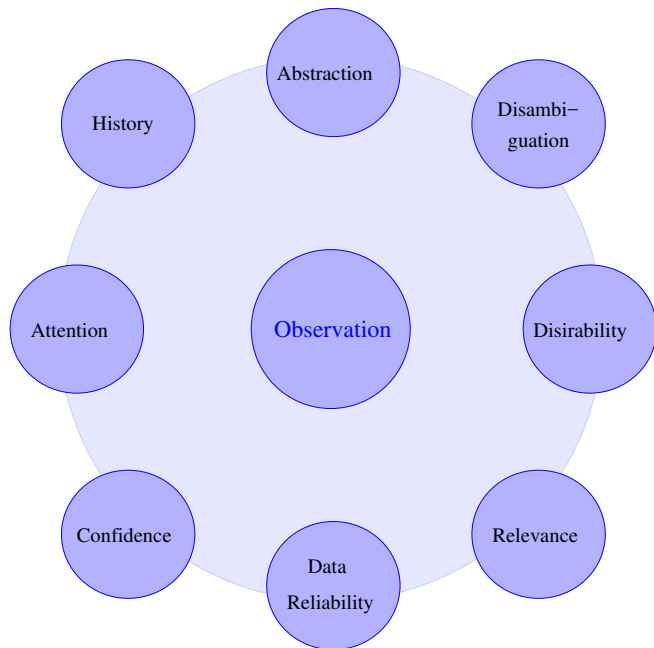


# Comprehensive Observation



Nima TaheriNejad, Axel Jantsch, and David Pollreisz. "Comprehensive Observation and its Role in Self-Awareness - An Emotion Recognition System Example". In: *Proceedings of the Federated Conference on Computer Science and Information Systems*. Gdansk, Poland, Sept. 2016

# Observation Circle



# Early Warning Score

Score	3	2	1	0	1	2	3
Heart rate <sup>1</sup>	<40	40–51	51–60	60–100	100–110	110–129	>129
Systolic BP <sup>2</sup>	<70	70–81	81–101	101–149	149–169	169–179	>179
Breath rate <sup>3</sup>		<9		9–14	14–20	20–29	>29
SPO <sub>2</sub> (%)	<85	85–90	90–95	>95			
Body temp. <sup>4</sup>	<28	28–32	32–35	35–38		38–39.5	>39.5

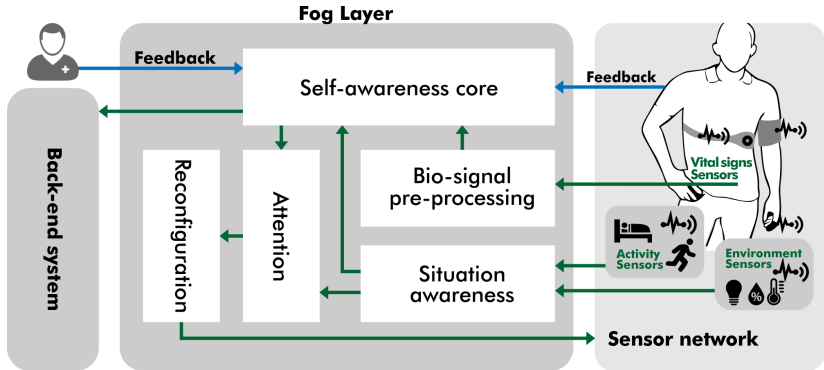
<sup>1</sup>beats per minute, <sup>2</sup>mmHg, <sup>3</sup>breaths per minute, <sup>4</sup> °C



# EWS Improvement

- ▶ Data reliability:
  - ▶ Values in reasonable scope
  - ▶ Changes in reasonable scope
  - ▶ Consistency between sensors
- ▶ Situation awareness
- ▶ Power efficiency

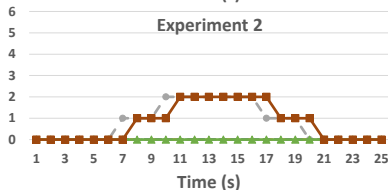
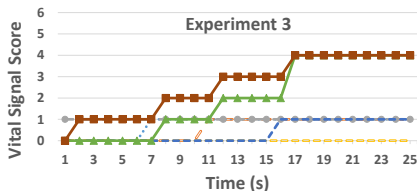
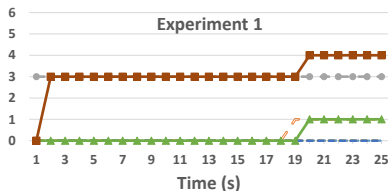
# Enhanced Early Warning Score



Arman Anzanpour et al. "Self-Awareness in Remote Health Monitoring Systems using Wearable Electronics". In: *Proceedings of Design and Test Europe Conference (DATE)*. Lausanne, Switzerland, Mar. 2017

# Enhanced Early Warning Score - Data Reliability

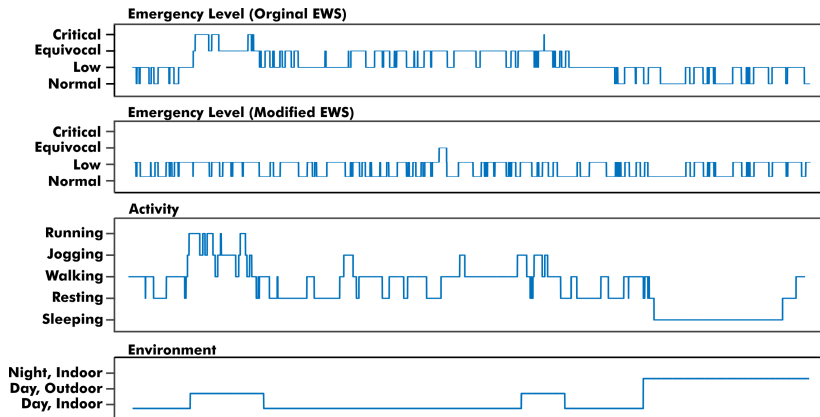
1. Check on the reliability of sensed values
2. Check on the reliability of value changes
3. Check on consistency between sensor data



- ..... Heart rate (beats/min)
- - - Respiratory rate (breaths/min)
- Body temperature (°C)
- - - Oxygen saturation (%)
- - - Systolic blood pressure (mmHg)
- ▲- Self-aware EWS
- EWS

# Enhanced Early Warning Score - Situation Awareness

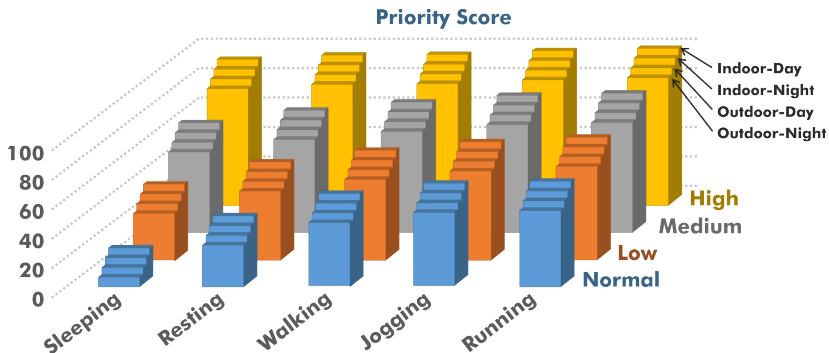
1. Consider the activity mode of person
2. Consider time of day
3. Consider location





# Enhanced Early Warning Score - Power Efficiency

## 1. Prioritize different situations



# Enhanced Early Warning Score - Power Efficiency

1. Prioritize different situations
2. Distinguish different modes of urgency

**Emergency  
Level:**

**Score:0  
Normal**

Indoor		Outdoor	
Day	Night	Day	Night

Sleeping	E	E	E	E
Resting	D	D	D	D
Walking	C	C	C	C
Jogging	C	C	C	C
Running	C	C	C	C

**Score:1-3  
Low**

Indoor		Outdoor	
Day	Night	Day	Night

Sleeping	C	D	D	D
Resting	C	C	C	C
Walking	B	C	C	C
Jogging	B	B	B	C
Running	B	B	B	B

**Score:4-6  
Medium**

Indoor		Outdoor	
Day	Night	Day	Night

Sleeping	B	C	C	C
Resting	B	B	B	B
Walking	B	B	B	B
Jogging	B	B	B	B
Running	B	B	B	B

**Score>6  
High**

Indoor		Outdoor	
Day	Night	Day	Night

Sleeping	A	A	B	B
Resting	A	A	B	B
Walking	A	A	A	B
Jogging	A	A	A	B
Running	A	A	A	A

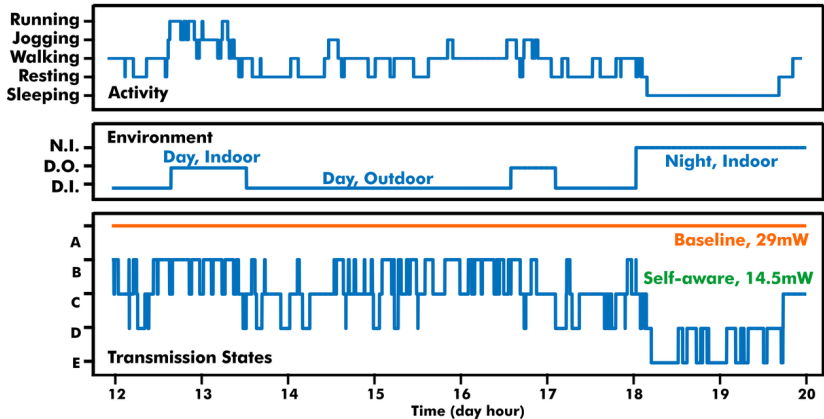
# Enhanced Early Warning Score - Power Efficiency

1. Prioritize different situations
2. Distinguish different modes of urgency
3. Define sensing activity for each mode

<b>State</b>	<b>Respiration Rate Activity</b>	<b>Blood Pressure</b>	<b>Heart Rate, SpO2, and Body Temp.</b>	<b>Transmission Power Consumption</b>
<b>A</b>	Continuous	Every hour in day Disabled in night	Every sec.	29 mW
<b>B</b>	2 min continuous 8 min OFF	Every hour in day Disabled in night	Every sec.	26.8 mW
<b>C</b>	2 min continuous 3 min OFF	Every 3 hours in day Disabled in night	Every min.	12.5 mW
<b>D</b>	2 min continuous 8 min OFF	Every 3 hours in day Disabled in night	Every min.	7 mW
<b>E</b>	2 min continuous 18 min OFF	Disabled	Every min.	4.3 mW

# Enhanced Early Warning Score - Power Efficiency

Over a day half the energy can be saved.

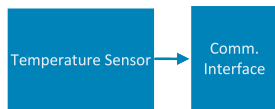


## Enhanced Early Warning Score Summary

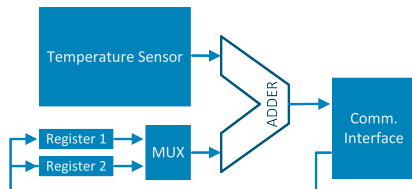
- ▶ Considering data reliability improves quality of observation;
- ▶ Considering situation improves quality of observation;
- ▶ Collecting needed data only improves efficiency.

# Attention Based Temperature Measurement

- ▶ How many temperature measurements are required in an MPSoC?
- ▶ It varies over several orders of magnitude depending on activity and current temperature.



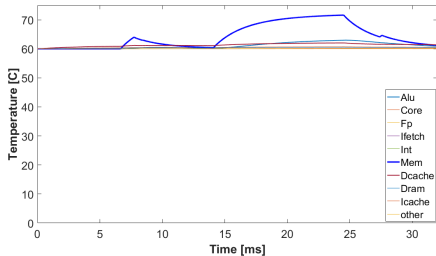
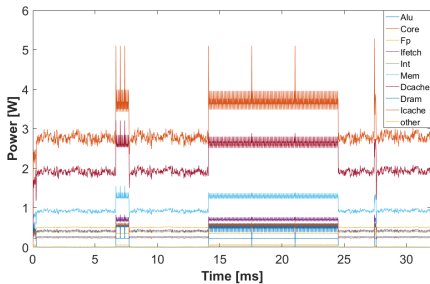
Conventional Architecture



Proposed Architecture

Nima TaheriNejad, M. Ali Shami, and Sai Manoj P. D. "Self-aware sensing and attention-based data collection in Multi-Processor System-on-Chips". In: *15th IEEE International New Circuits and Systems Conference (NEWCAS)*. June 2017, pp. 81–84

# Attention Based Temperature Measurement



Intel Nehalem processor, running Barnes from SPLASH-2 Benchmarks, using Snipersim and Hotspot.

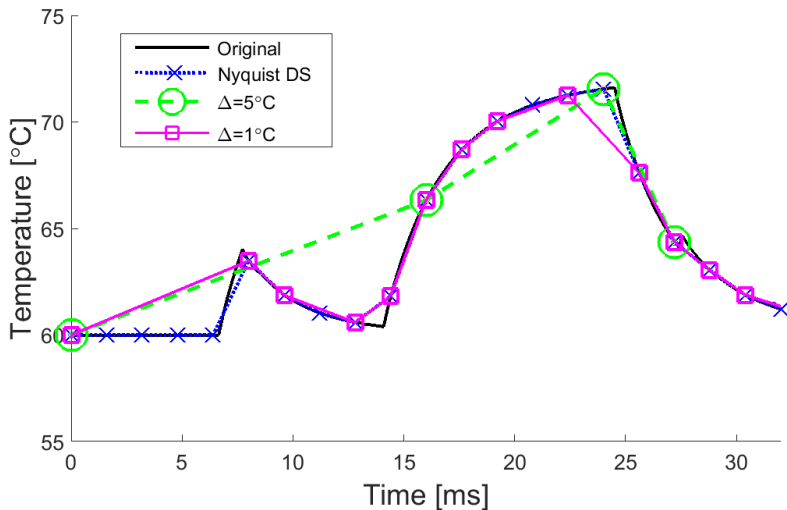
# Attention Based Temperature Measurement

- ▶ When only differences  $> \Delta = 1, 2, 5^{\circ}\text{C}$  are reported, 7 out of 10 sensors send only 1 value in this experiment.
- ▶ Reduction of temperature reports for Memory, ALU and D-Cache:

Unit	$\Delta = 1$	Imp.	$\Delta = 2$	Imp.	$\Delta = 5$	Imp.
Memory	13	35%	9	55%	4	80%
ALU	4	80%	2	90%	1	95%
D-Cache	2	90%	2	90%	1	95%
All others	1	95%	1	95%	1	95%



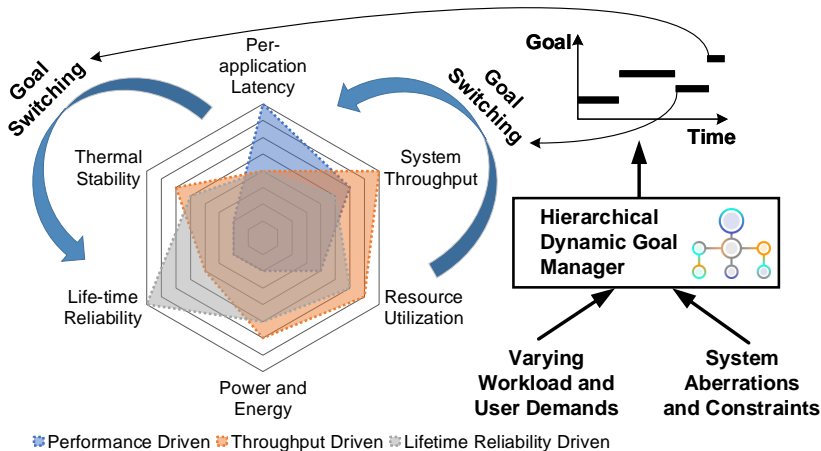
# Attention Based Temperature Measurement



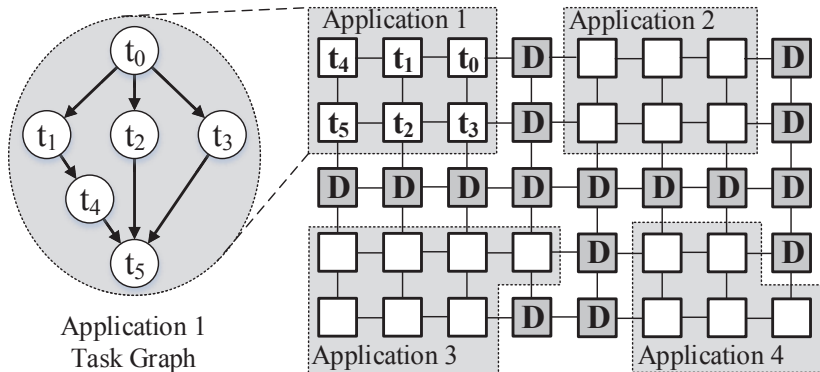
# Attention Based Temperature Measurement

- ▶ Rate of temperature reporting can be significantly reduced and fine tuned;
- ▶ Can depend on
  - ▶ relative difference,
  - ▶ absolute difference,
  - ▶ absolute value,
  - ▶ system level mode;
- ▶ Potential benefits:
  - ▶ reduced processing,
  - ▶ reduced communication,
  - ▶ reduced measurements.

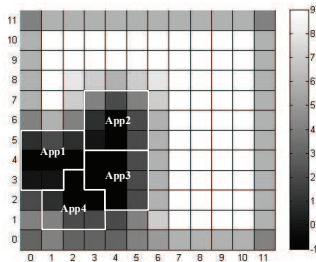
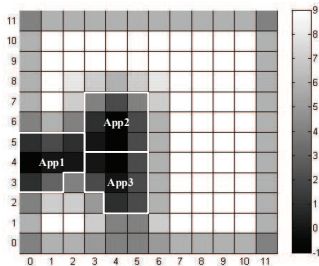
# Goals for Dynamic Task Mapping



# Dynamic Task Mapping



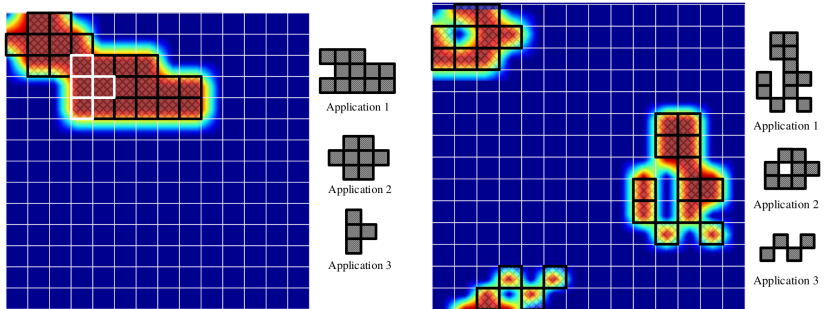
# Example 1: Performance Driven Task Mapping



MapPro prefers compact and contiguous regions.

Mohammad-Hashem Haghighyan et al. "MapPro: Proactive Runtime Mapping for Dynamic Workloads by Quantifying Ripple Effect of Applications on Networks-on-Chip". In: *Proceedings of the International Symposium on Networks on Chip*. Vancouver, Canada, Sept. 2015

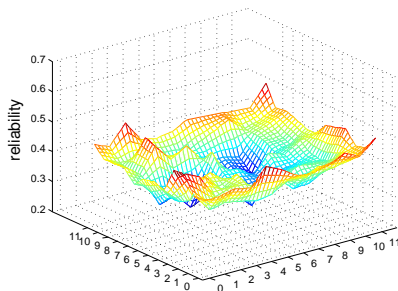
# Example 2: Throughput- and Power-Constrained Task Mapping



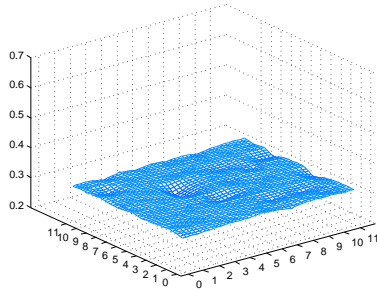
The patterning algorithm disperses mapped cores to maximize the Thermal Safe Power budget.

Anil Kanduri et al. "Dark Silicon Aware Runtime Mapping for Many-core Systems: A Patterning Approach". In: *Proceedings of the International Conference on Computer Design (ICCD)*. New York City, USA, Oct. 2015, pp. 610–617

# Example 3: Lifetime-Reliability-Driven Task Mapping



MapPro:  
lifetime=5.52 years



Reliability aware mapping:  
lifetime=12 years

The plots show the reliability of cores at the end of the system's lifetime.  
The end of the system's life is reached when the reliability of one core drops below 30%.

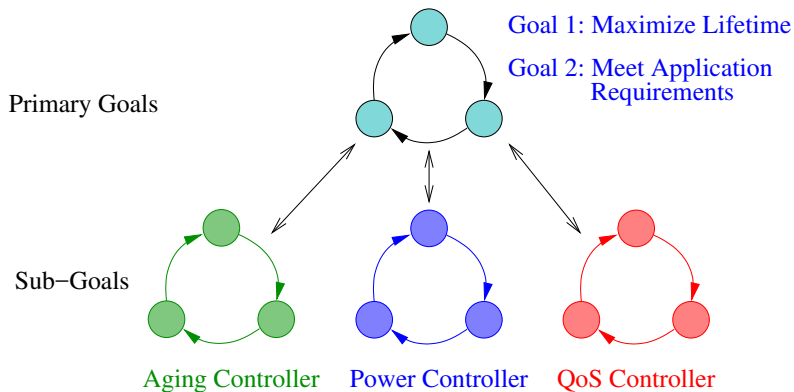
M. H. Haghbayan et al. "A lifetime-aware runtime mapping approach for many-core systems in the dark silicon era".  
In: *Design, Automation Test in Europe Conference Exhibition (DATE)*. Mar. 2016, pp. 854–857

# Goal Management Levels

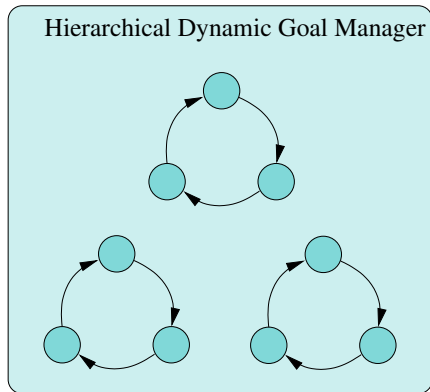
1. Single objective; Design time;
2. Multiple objectives; Design time;
3. Multiple objectives; Run time;
4. Multiple, hierarchical objectives; Run time;



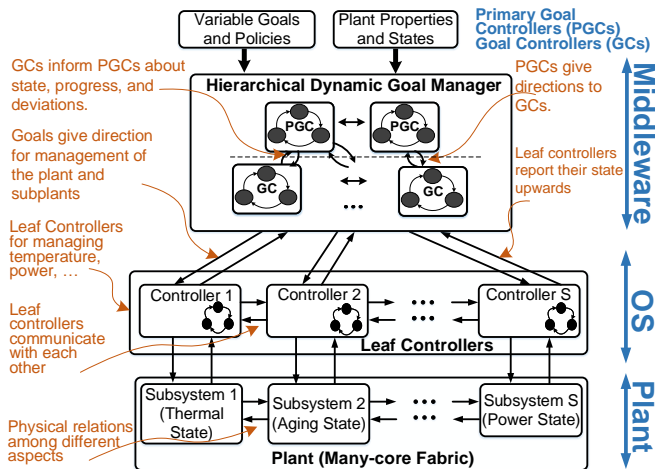
# Hierarchical Goal Management



# Goal Management Inputs



# Hierarchical Goal Management



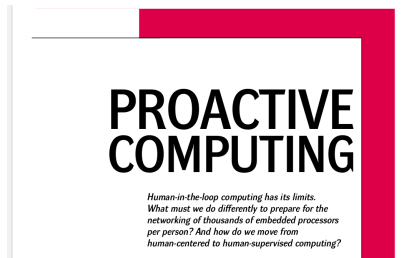
- ▶ The system's requirements changes over its lifetime.
- ▶ Different objectives are invoked at different time.

# Challenges with Self-aware, Autonomous, Adaptive SoCs

- ▶ How to express “correctness”?
- ▶ How to validate a smartly adapting system?
- ▶ How to reconcile autonomy with safety critical and real-time systems?
- ▶ How to formally model and implement goal management?

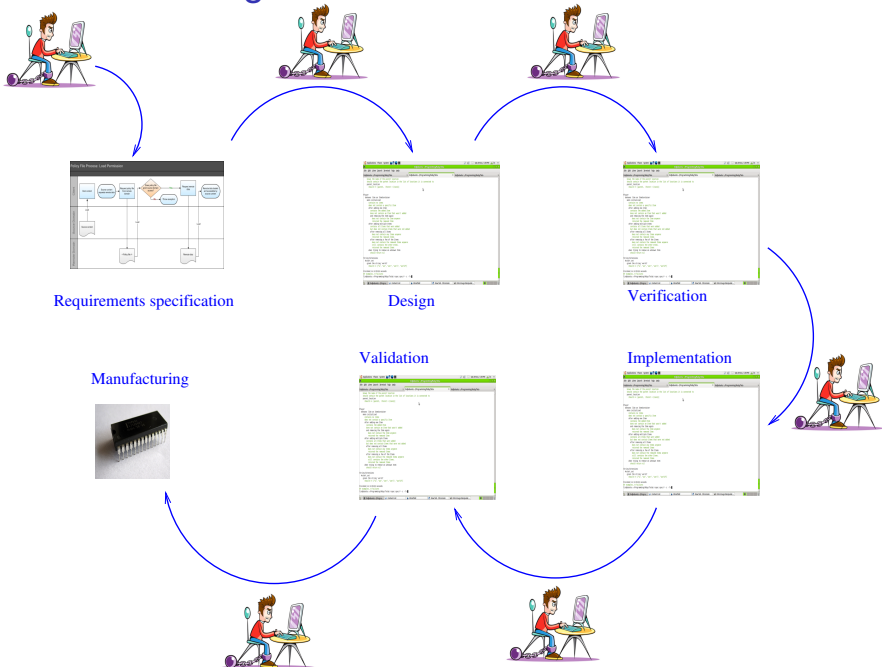
# Let's Get Out

- ▶ Let's get physical
- ▶ Let's get real
- ▶ Let's get out

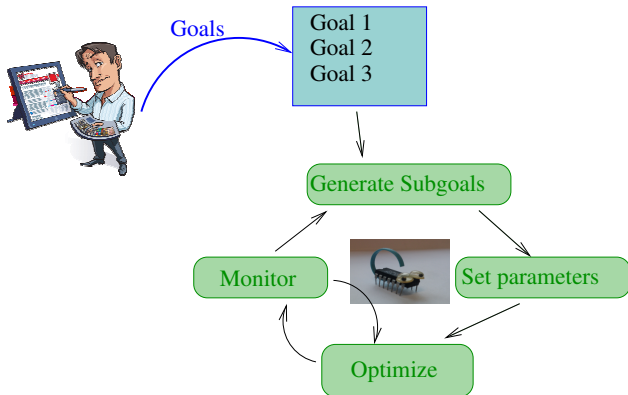


David Tennenhouse. "Proactive Computing". In:  
*Communications of the ACM* 43.5 (May 2000), pp. 43–50

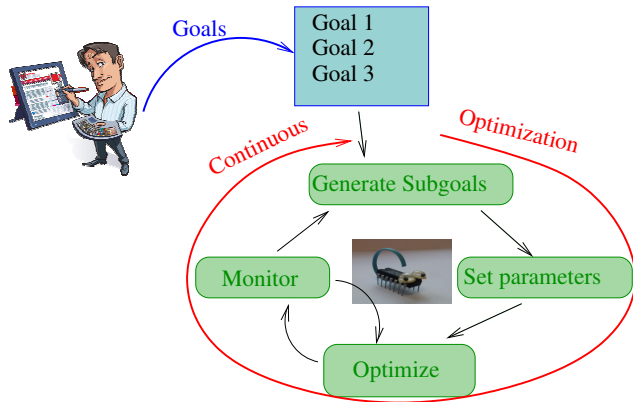
# Traditional Design Flow



# Design of Self-Aware Chips

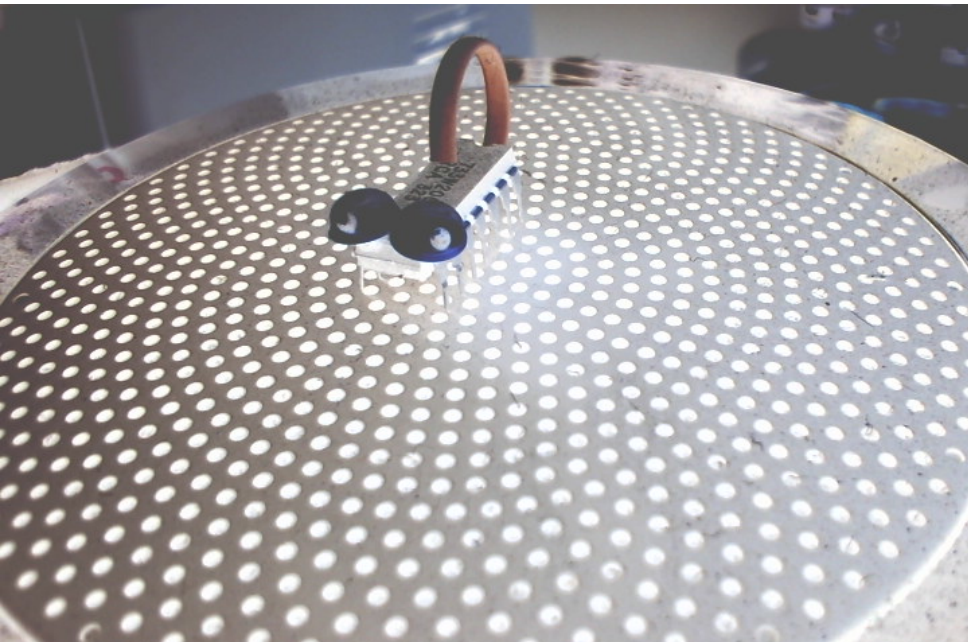


# Design of Self-Aware Chips





# Questions ?



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