

# Heterogeneous Post-CMOS Technologies Meet Software

## Jeronimo Castrillon

Chair for Compiler Construction, TU Dresden  
[jeronimo.castrillon@tu-dresden.de](mailto:jeronimo.castrillon@tu-dresden.de)

Post Moore Interconnects Workshop  
ISC High Performance  
Frankfurt, Germany, June 23 2018

## Context: Center for advancing electronics Dresden

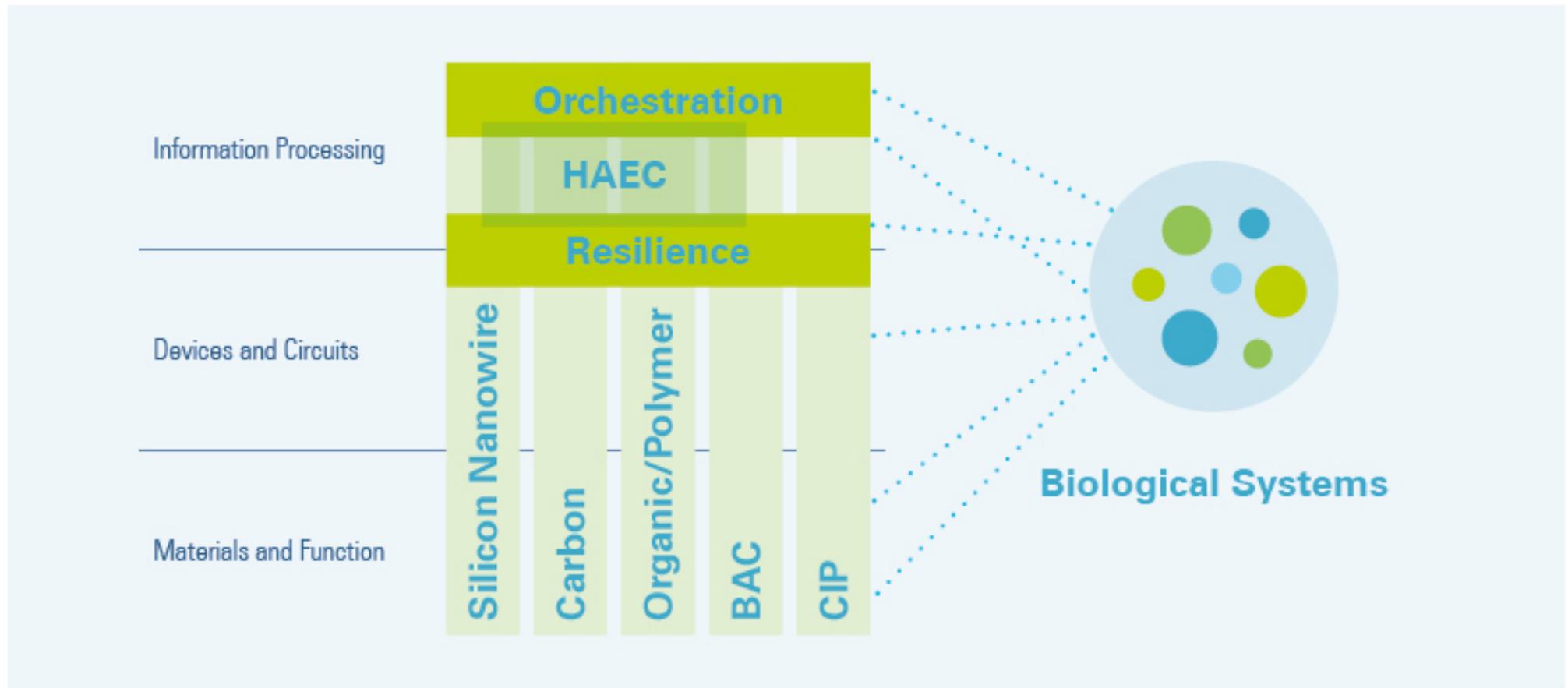


- ❑ Large German Excellent Cluster
- ❑ **Goal: “to explore new technologies for electronic information processing which overcome the limits of CMOS technology”**
- ❑ Multiple participating organizations



- ❑ Multiple disciplines:: Electrical Engineering, Computer Science, Materials, Chemistry, Physics, Biology

# Cfaed Research Program (from 2012)



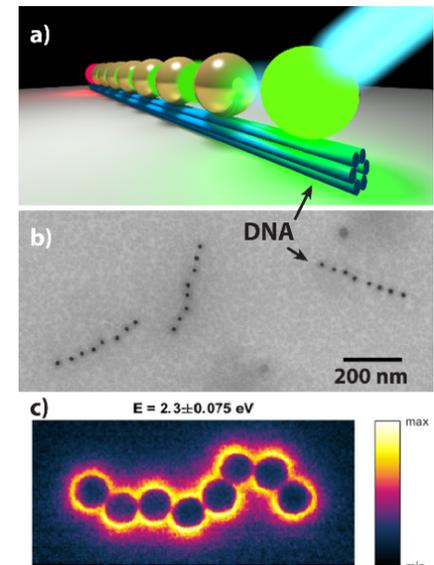
## Examples: Transistors, memory, interconnect and unconventional computing

### Protein-based computing



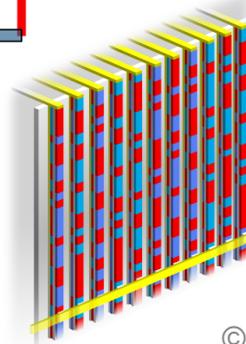
Nicolau, Dan V., et al. "Parallel computation with molecular-motor-propelled agents in nanofabricated networks". PNAS 2016.

### Plasmonic waveguides



Gür, Fatih N., et al. "Toward self-assembled plasmonic devices: high-yield arrangement of gold nanoparticles on DNA origami templates." ACS nano 10.5 (2016): 5374-5382.  
 Gür, Fatih N., et al. "Self-assembled plasmonic waveguides for excitation of fluorescent nanodiamonds." arXiv preprint arXiv:1712.09141 (2017).

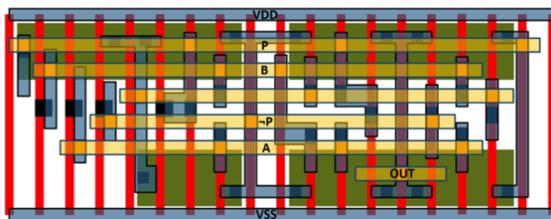
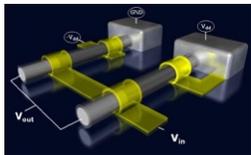
### Spin-orbit Racetracks



Parkin, US patents 6834005, 6898132.  
 Parkin et al., Science 320, 190 (2008).  
 Parkin, Scientific American (2009).

© J. Castrillon. ISC - Post-Moore, 2018

### Reconfigurable transistors



M. Raitza, et al., "Exploiting Transistor-Level Reconfiguration to Optimize Combinational Circuits", DATE 2017

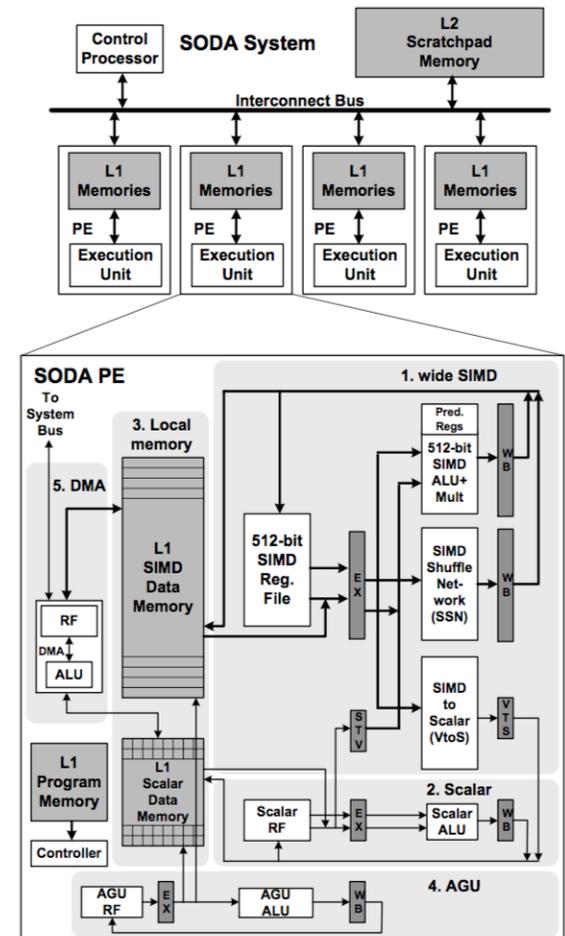


# Software and heterogeneous systems

- ❑ Heterogeneous systems in niches for more than 30 years
  - ❑ Baseband processing (DSPs, hardwired accelerators)
  - ❑ Network processing units
  - ❑ Also doing approximate computing for a long time

## Challenges

- ❑ Make it usable for a broader community for larger systems (also at the borders of computer science)
- ❑ Extreme heterogeneity: Still too much to understand



Woh, Mark, et al. "From SODA to scotch: The evolution of a wireless baseband processor." *Micro*, 2008

# Challenges for SW systems

## ❑ **Orthogonalization of concerns**

- ❑ Reduce the amount of rework if some part of the system changes
- ❑ Separate core algorithm from their memory access (via abstractions)

## ❑ **Interoperability/interaction**

- ❑ Interface components to talk to each other w/o knowing architectural properties
- ❑ HW interfaces to provide safe non-OS-dependent interaction
- ❑ Accelerators as first class citizens in systems

# Challenges for SW systems (2)

## ❑ Isolation

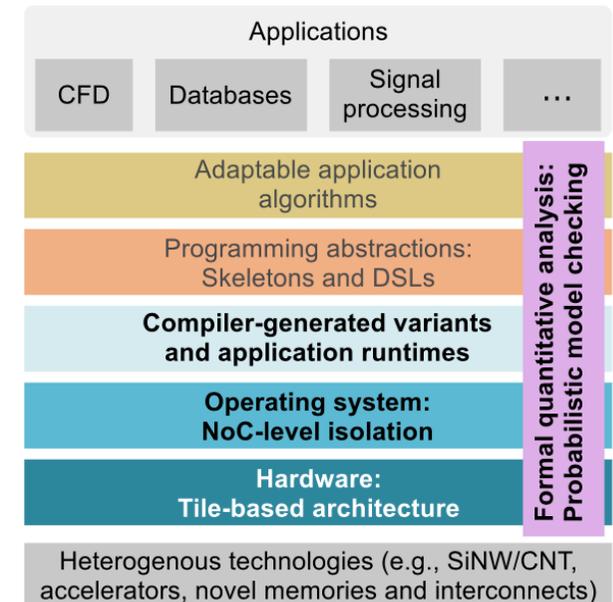
- ❑ Extreme heterogeneity means even more unexpected behavior in systems
- ❑ Simple isolation mechanisms (capability-based) with hardware support to avoid expensive OS intervention

## ❑ Abstractions

- ❑ Hide complexity from application developer (e.g. domain-specific languages)
- ❑ Models and monitoring for automatic SW/HW adaptation
- ❑ Fast and decentralized resource allocators complemented by sporadic global reorganizations

# SW for extreme heterogeneity

- ❑ Investigating principles for a programming stack
- ❑ Programming abstractions
  - ❑ High-level: Domain-Specific Languages (DSLs)
  - ❑ Lower-level: Dataflow execution models
- ❑ Execution abstractions
  - ❑ Application runtimes for adaptativity
  - ❑ Micro-kernel based Oses
- ❑ Models of machines and computation
- ❑ Requires models: SW people require closer communication with technologists!



J. Castrillon, et al. "A Hardware/Software Stack for Heterogeneous Systems". IEEE TMSCS, 2017

# SW for extreme heterogeneity

- ❑ Working on principles for a programming st
- ❑ Programming abstractions
  - ❑ High-level: Domain-Specific Languages (DSL)
  - ❑ Lower-level: Dataflow execution models
- ❑ Execution abstractions
  - ❑ Application runtimes for adapativity
  - ❑ Micro-kernel based Oses
- ❑ Models of machines and computation

Report from Dagstuhl Seminar 17061

## Wildly Heterogeneous Post-CMOS Technologies Meet Software

Edited by

Jerónimo Castrillón-Mazo<sup>1</sup>, Tei-Wei Kuo<sup>2</sup>, Heike E. Riel<sup>3</sup>, and Matthias Lieber<sup>4</sup>

1 TU Dresden, DE, [jeronimo.castrillon@tu-dresden.de](mailto:jeronimo.castrillon@tu-dresden.de)

2 National Taiwan University – Taipei, TW, [ktw@csie.ntu.edu.tw](mailto:ktw@csie.ntu.edu.tw)

3 IBM Research Zurich, CH, [hei@zurich.ibm.com](mailto:hei@zurich.ibm.com)

4 TU Dresden, DE, [matthias.lieber@tu-dresden.de](mailto:matthias.lieber@tu-dresden.de)

### Abstract

The end of exponential scaling in com  
years by now. While advances in f  
predicted, the so anticipated end seem  
“Wildly Heterogeneous Post-CMOS T  
material research, hardware compon  
systems. By bringing together exper  
interdisciplinarily across fields, the se  
challenges of advancing computing b  
visions about a future hardware/soft

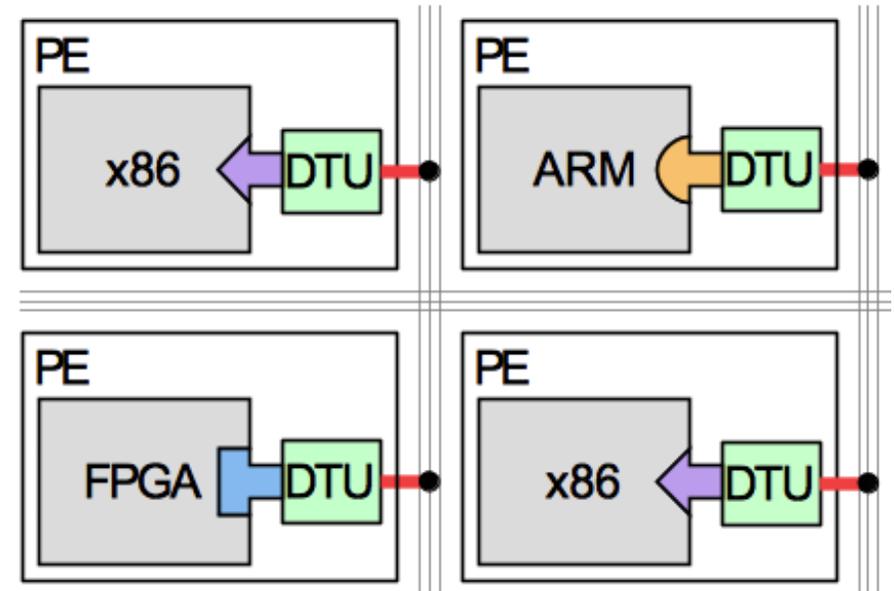
Seminar February 5-10, 2017 – <http://www.dagstuhl.de/ds17061>



- ❑ **Requires models: SW people require closer communication with technologists!**

# HW Interfaces and Microkernels

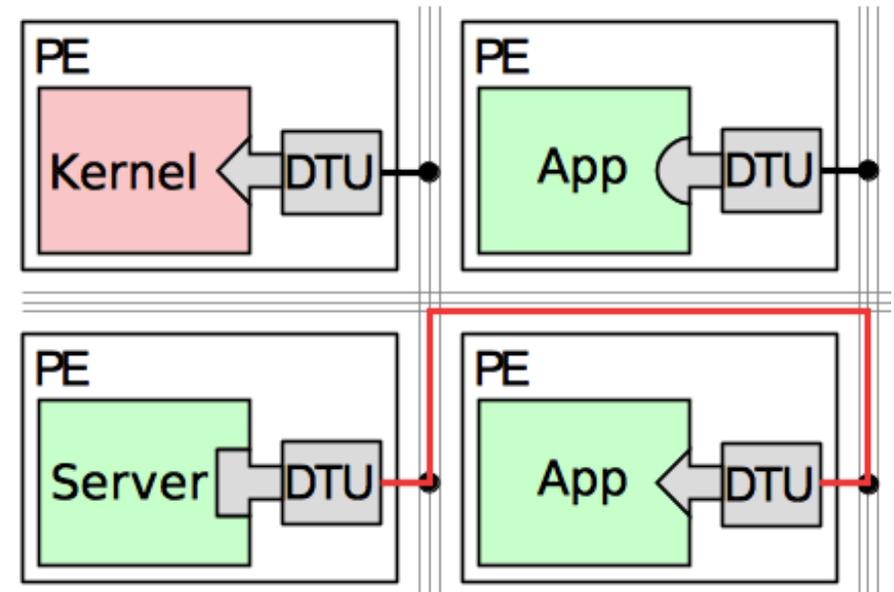
- Data-Transfer Unit (DTU)
  - Unified interface for **interoperability** of heterogeneous components
  - HW-level **isolation**: access to external resources controlled by DTU
  - Simplifies management of heterogeneous components



N. Asmussen, et al., "M3: A Hardware/Operating-System Co-Design to Tame Heterogeneous Manycores", ASPLOS'16

# HW Interfaces and Microkernels

- ❑ Data-Transfer Unit (DTU)
  - ❑ Unified interface for **interoperability**
  - ❑ HW-level **isolation**
  - ❑ Simplified management
- ❑  $M^3$ : OS on top of DTU
  - ❑ **Isolation**: Kernel lets DTU enforce access/communication restrictions
  - ❑ Kernel is only responsible to establish communication channels
  - ❑ **Interaction**: components can directly communicate w/o OS intervention



N. Asmussen, et al., "M3: A Hardware/Operating-System Co-Design to Tame Heterogeneous Manycores", ASPLOS'16

Exotic HW can access system resources (isolated and low overhead)

# Domain-specific languages

- ❑ Higher-level algorithmic abstractions
  - ❑ More information makes it easier to optimize and adapt to
  - ❑ Examples: Tensor objects and operators, particle-based simulation

```

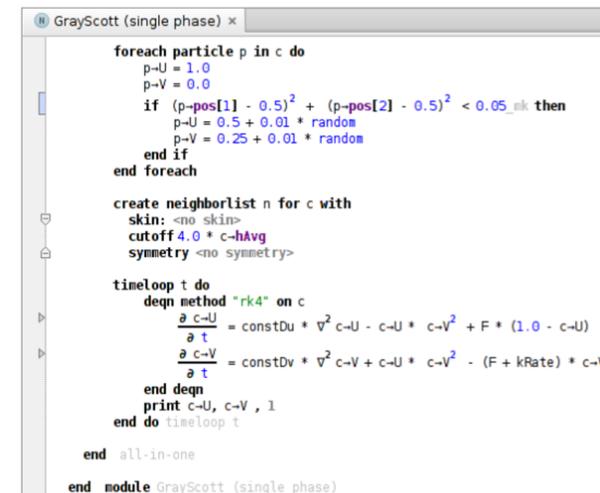
source =
type matrix      : [mp np]      &
type tensorIN   : [np np np ne] &
type tensorOUT  : [mp mp mp me] &
&
var input A      : matrix        &
var input u      : tensorIN      &
var input output v : tensorOUT   &
var input alpha  : []            &
var input beta   : []            &
&
v = alpha * (A # A # A # u .
             [[5 8] [3 7] [1 6]]) + beta * v

```

## Fortran embedding + JIT compilation

A. Susungi, et al., "Towards Compositional and Generative Tensor Optimizations" GPCE 17

N. A. Rink, et al., "CFDlang: High-level code generation for high-order methods in fluid dynamics", RWDSL 2018



```

GrayScott (single phase) x
foreach particle p in c do
  p-U = 1.0
  p-V = 0.0
  if (p-pos[1] - 0.5)^2 + (p-pos[2] - 0.5)^2 < 0.05_ek then
    p-U = 0.5 + 0.01 * random
    p-V = 0.25 + 0.01 * random
  end if
end foreach

create neighborlist n for c with
  skin: <no skin>
  cutoff 4.0 * c-hAvg
  symmetry <no symmetry>

timeloop t do
  deqn method "rk4" on c
    ∂ c-U / ∂ t = constDu * v^2 c-U - c-U * c-V^2 + F * (1.0 - c-U)
    ∂ c-V / ∂ t = constDv * v^2 c-V + c-U * c-V^2 - (F + kRate) * c-V
  end deqn
  print c-U, c-V, 1
end do timeloop t

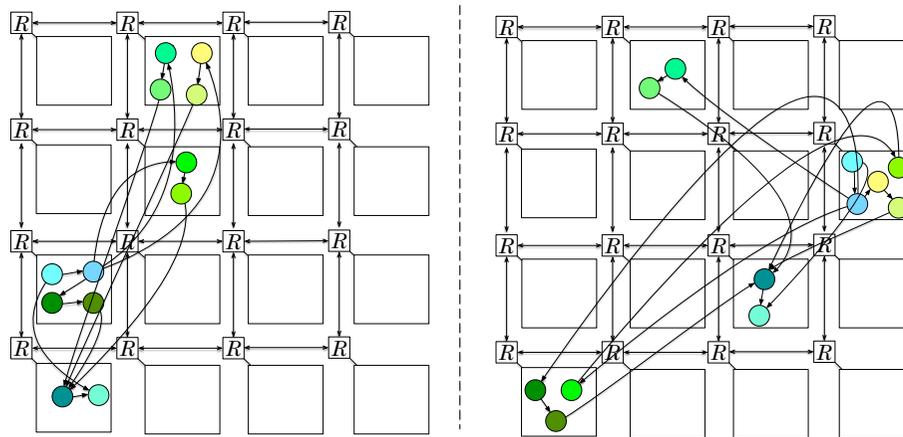
end all-in-one

end module GrayScott (single phase)

```

Karol, S. et al. "A Domain-Specific Language and Editor for Parallel Particle Methods", ACM TOMS, 2018.

- Dataflow: Formal execution semantics for transformations (compile and runtime)



Goens, A. et al. "Symmetry in Software Synthesis".  
In: ACM TACO (2017)

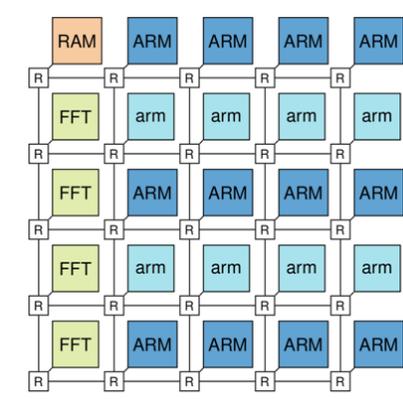
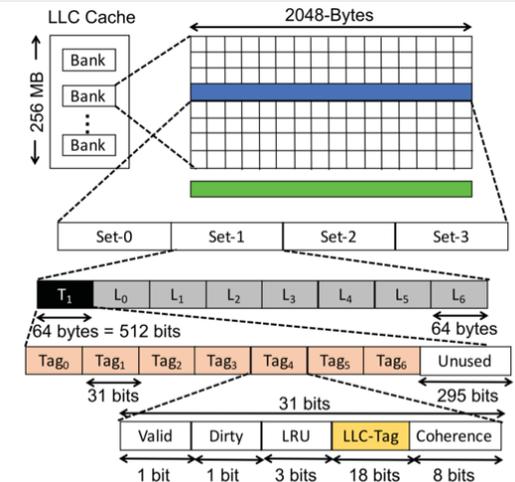
- Used in the past for highly heterogeneous systems

- Effort to describe abstractly the behavior and the interfacing of accelerators

J. Castrillon, et al., "Component-based waveform development: The nucleus tool flow for efficient and portable software defined radio", In ALOG'11

# Evaluation vehicle: Simulation (emulation)

- ❑ Huge effort in system simulation
- ❑ Mixture of technologies: sampling, trace-based, ...
- ❑ Extending: NVMain, Gem5, DRAMSys, ...
  - ❑ Many collaborators
  - ❑ Need abstractions here as well!



C. Menard, et al. "System Simulation with gem5 and SystemC: The Keystone for Full Interoperability", SAMOS, pp. 62–69, Jul 2017.

A. A. Khan, et al. "NVMain Extension for Multi-Level Cache Systems", RAPIDO Workshop, HiPEAC, ACM, pp. 7:1–7:6, Jan 2018.

F. Hameed, et al. "Performance and Energy Efficient Design of STT-RAM Last-Level-Cache", In IEEE Transactions on Very Large Scale Integration Systems (TVLSI), vol. 26, no. 6, pp. 1059–1072, Jun 2018.

# Summary

- ❑ Cfaed: Center for advancing electronics Dresden
- ❑ Alternative technologies: Reconfigurable transistors, plasmonic waveguides, ...
- ❑ Scientific platform to start addressing software challenges
  
- ❑ Principles: Orthogonalization, interoperability, isolation and abstraction
  - ❑ Examples of OS and language research
  - ❑ Many works ahead!

# References

- M. Raitza, et al., "Exploiting Transistor-Level Reconfiguration to Optimize Combinational Circuits", DATE 2017
- Nicolau, Dan V., et al. "Parallel computation with molecular-motor-propelled agents in nanofabricated networks". PNAS 2016.
- Parkin, US patents 6834005, 6898132.
- Parkin et al., Science 320, 190 (2008).
- Parkin, Scientific American (2009).
- Gür, Fatih N., et al. "Toward self-assembled plasmonic devices: high-yield arrangement of gold nanoparticles on DNA origami templates." ACS nano 10.5 (2016): 5374-5382.
- Gür, Fatih N., et al. "Self-assembled plasmonic waveguides for excitation of fluorescent nanodiamonds." arXiv preprint arXiv:1712.09141 (2017).
- Woh, Mark, et al. "From SODA to scotch: The evolution of a wireless baseband processor." Micro, 2008
- J. Castrillon, et al. "A Hardware/Software Stack for Heterogeneous Systems". IEEE TMSCS, 2017
- J. Castrillon, Tei-Wei Kuo, Heike E. Riel, Matthias Lieber, "Wildly Heterogeneous Post-CMOS Technologies Meet Software (Dagstuhl Seminar 17061)", In Dagstuhl Reports vol. 7, no. 2, pp. 1–22, Dagstuhl, Germany, Aug 2017
- N. Asmussen, et al., "M3: A Hardware/Operating-System Co-Design to Tame Heterogeneous Manycores", ASPLOS'16
- A. Susungi, et al., "Towards Compositional and Generative Tensor Optimizations" GPCE 17
- N. A. Rink, et al., "CFDlang: High-level code generation for high-order methods in fluid dynamics", RWDSL 2018
- Goens, A. et al. "Symmetry in Software Synthesis". In: ACM TACO (2017)
- J. Castrillon, et al., "Component-based waveform development: The nucleus tool flow for efficient and portable software defined radio", In ALOG'11
- C. Menard, et al. "System Simulation with gem5 and SystemC: The Keystone for Full Interoperability", SAMOS, pp. 62–69, Jul 2017
- A. A. Khan, et al. "NVMain Extension for Multi-Level Cache Systems", RAPIDO Workshop, HiPEAC, ACM, pp. 7:1–7:6, Jan 2018
- F. Hameed, et al. "Performance and Energy Efficient Design of STT-RAM Last-Level-Cache", In IEEE Transactions on Very Large Scale Integration Systems (TVLSI), vol. 26, no. 6, pp. 1059–1072, Jun 2018