

Department of Computer Science Computer Engineering Group www.upb.de/cs/ag-platzner

# Paul Kaufmann, Marco Platzner

Multi-objective Intrinsic Evolution of Embedded Systems (MOVES)

### Motivation and Goals

Investigate intrinsic evolution as a mechanism to achieve selfadaptation and –optimization for autonomous embedded systems.

Develop autonomous embedded systems that are capable to ...

- adapt to slow changes caused by the environment
- adapt to radical changes caused by faults or reassignment of system resources

This is achieved by a combination of biologically-inspired methods, multi-objective optimization and reconfigurable

#### Biologically inspired methods

- adapt to slow changes by simulated evolution
- generate hardware functions by evolutionary design (evolvable hardware)

#### Multi-objective optimization

- multi-objective evolutionary algorithms compute reasonable comprises in the presence of conflicting optimization criteria
- adapt to radical changes by switching to pre-evolved alternatives

#### Reconfigurable hardware

- the adaptability of hardware resources requires reconfigurable hardware technology
- autonomous operation requires the evolutionary optimizer to run on the same embedded target as the optimized function



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### hardware.



### Models

Evolutionary algorithms require a hardware representation model to encode the chromosomes of the candidate solutions. The hardware representation model should be ...

- close to the target technology for a simplified mapping
- application-specific to improve the evolutionary algorithm's convergence behavior



Cartesian Genetic Programming model

## **Evolutionary Algorithms**

Stochastic search algorithms using the bio-inspired operators recombination, mutation and selection to steer the search process.

Particularly suitable for applications where ...

- the optimal solution is unknown or too complex to compute
- the functional quality depends on input data



# Experimentation Environment



#### MOVES graphical user interface

MOVES simulation framework

- modularized framework for evolvable hardware experiments
  - different hardware representation models
  - different optimization objectives
  - different (multi-objective) evolutionary algorithms
- graphical analysis tools



Genetic algorithm

- export of resulting circuits to the Xilinx tool chain
- interface to the grid software CONDOR



EvoCaches: Benchmarks



- new tag is based on classic tag+index
- reconfigurable circuit maps tag to cache line
- optimization algorithm improves the mapping

Metrics:

- execution time [cycles]
- miss-rate
- energy estimation



#### Test performance of optimized:

- level one instruction and data cache
- level one instruction and data cache, level two unified cache



### Prof. Dr. Marco Platzner Paul Kaufmann Warburger Str. 100 D-33098 Paderborn Email:paul.kaufmann@upb.de

### Recent Publications:

Evolvable Cache Controller: Optimizing of memory-to-cache address mapping function

Paul Kaufmann, Christian Plessl, and Marco Platzner. EvoCaches: Application-specfic Adaptation of Cache Mappings. In Proceedings of the Adaptive Hardware and Systems (AHS'09), IEEE 2009

Alexander Boschmann and Paul Kaufmann and Marco Platzner and Michael Winkler. Towards Multi-movement Hand Prostheses: Combining Adaptive Classification with High Precision Socket. In Proceedings of the 2nd European Conference on Technically Assisted Rehabilitation (TAR'09), 2009.

Kyrre Glette, Jim Torresen, Thiemo Gruber, Bernhard Sick, Paul Kaufmann, and Marco Platzner. Comparing Evolvable Hardware to Conventional Classifiers for Electromyographic Prosthetic Hand Control. In Proceedings of the NASA/ESA Conference on Adaptive Hardware and Systems (AHS), Noordwijk, The Netherlands, June 2008.