

Iason Filippopoulos

# Exploration of energy efficient memory organizations exploiting data variable based system scenarios

Doctoral thesis  
for the degree of philosophiae doctor

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Norwegian University of Science and Technology  
Faculty of Information Technology, Mathematics and Electrical Engineering  
Department of Electronics and Telecommunications

**NTNU**

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## Abstract

Modern embedded systems are capable of performing a wide range of tasks and their popularity is increasing in many different application domains. The recent progress on the semiconductor processing technology greatly improves the performance of the embedded systems, due to the increased number of transistors on a single chip. The continuous performance improvement increases the possibilities for new embedded system designs. However, many embedded systems rely on a battery source, which puts a significant limitation on their lifetime and usage.

In this thesis, we focus on the design of energy efficient memory architectures for embedded systems. A hardware/software co-design methodology is proposed for the reduction of the energy consumption on the memory subsystem. The methodology exploits variations in memory needs during the lifetime of an application in order to optimize energy usage. The different resource requirements, that change dynamically at run-time, are organized into groups to efficiently handle a very large exploration space. Apart from the development of the methodology, an extended memory model is included in this work. The memory models is based on existing state-of-the-art memories, available from industry and academia. In addition, the impact of the technology scaling is studied and the effectiveness of the proposed methodology is analyzed for the future memory architectures.

We also investigate the combination of the developed methodology with known code transformation techniques, specifically data interleaving. The proposed design methodology aims to be compatible with the already available code optimization techniques. We further extend the evaluation of the memory design methodology using a test-case wireless system. The proposed reconfigurable memory subsystem is studied in a dynamic platform with several reconfiguration options that combine the memory and the processing elements.



# Preface

This doctoral thesis was submitted to the Norwegian University of Science and Technology (NTNU) in partial fulfillment of the requirements for the degree philosophiae doctor (PhD). The thesis is a part of a dual PhD program between NTNU and the Catholic University of Leuven (K. U. Leuven), in cooperation with Interuniversity Microelectronics Center (IMEC). The work herein was performed at the Department of Electronics and Telecommunications, NTNU and the Department of Electrical Engineering, KU Leuven. The work was performed under the supervision of Professor Per Gunnar Kjeldsberg and Professor Francky Catthoor.

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September 2015



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- what is our general goal
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- 1.3 Brief summary of current way of tackling and what has not been addressed here
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## Chapter 2

# Background

**2.1 Scratch-pad Memory Architectures - related work incl**

**2.2 System Scenarios - all the literature with focus on the ones related**

- vs. use case - pareto

**2.3 DTSE**

-



# Chapter 3

## Methodology

### 3.1 System Scenario Platform

3.1.1 Target memory platform architecture

3.1.2 Memory models

3.1.3 Technology scaling

### 3.2 Data variable based memory-aware system scenario methodology

3.2.1 Interleaving exploration based on data variables

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# Research Results and Contributions

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# Conclusions