

# Programming abstractions and optimizing compilers for energy-efficient computing

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**abstract:** The demise of scaling laws in micro-electronics has led to an era of innovation in software and hardware architectures aimed at improving the energy efficiency of computing systems. Albeit still highly relevant, software optimizations for mainstream systems, which make the bulk of today's computing systems, provide ever-decreasing returns in the range of single-digit percentages. This is why lots of attention has rightfully turn to domain-specific architectures and emerging technologies which promise improvements of one to several orders of magnitude. Software development for these novel systems is still characterized by low-level expert coding and brittle toolchains, preventing hardware innovations from reaching a broader impact. In this talk, we discuss ongoing efforts on providing high-level programming abstractions and optimizing compilers to automatically target emerging computing systems. We do this by looking at three ongoing projects.

First, we describe a collaborative HW-SW effort to reduce the energy footprint of baseband processing in upcoming cellular networks, predicted to surpass the 1500 TWh mark in 2030 [1]. We discuss an ongoing effort to model and simulate different 5G and user profiles [7] in the context of the award-winning BMBF E4C project<sup>1</sup>. We show how the semantic information provided by dataflow models can be leveraged for domain-specific resource allocation and scheduling at the stringent latency constraints of 5G baseband processing [4].

We then discuss ongoing efforts in the EU EVEREST Project<sup>2</sup> to build a *system development kit* for heterogeneous and reconfigurable systems [5]. Concretely, we describe an MLIR-based end-to-end compilation flow from tensor abstractions [10, 6] onto state-of-the-art reconfigurable systems [9].

Finally, we describe an extensible compilation flow for linear algebra abstractions that transparently generates code for novel in-memory and near-memory computing systems [8, 2]. This is ongoing work in the context of the DFG HetCIM project within the Priority Program on Disruptive Memory Technologies (SPP 2377)<sup>3</sup>. In this context, we discuss recently proposed in-memory computing using racetrack memory [3] as a promising direction for highly dense, robust and energy-efficient systems.

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<sup>1</sup>[bit.ly/3LXdKSo](https://bit.ly/3LXdKSo)

<sup>2</sup><https://everest-h2020.eu>

<sup>3</sup><https://spp2377.uos.de>

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