# Understanding a Modern Processing-in-Memory Architecture:

**Benchmarking and Experimental Characterization** 

Juan Gómez Luna, Izzat El Hajj, Ivan Fernandez, Christina Giannoula, Geraldo F. Oliveira, Onur Mutlu

https://arxiv.org/pdf/2105.03814.pdf https://github.com/CMU-SAFARI/prim-benchmarks



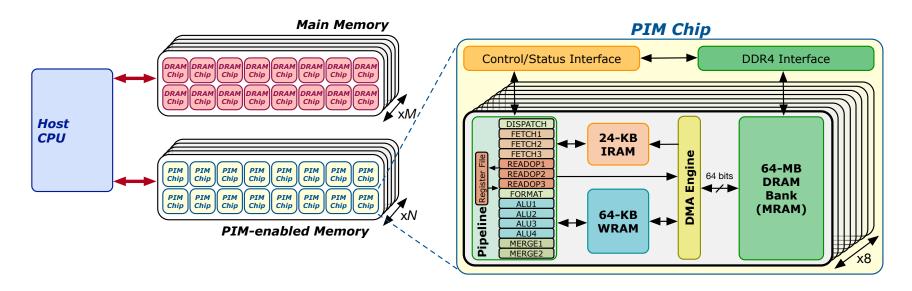


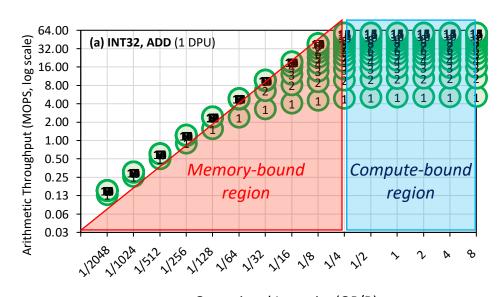
### **Executive Summary**

- Data movement between memory/storage units and compute units is a major contributor to execution time and energy consumption
- Processing-in-Memory (PIM) is a paradigm that can tackle the data movement bottleneck
  - Though explored for +50 years, technology challenges prevented the successful materialization
- UPMEM has designed and fabricated the first publicly-available real-world PIM architecture
  - DDR4 chips embedding in-order multithreaded DRAM Processing Units (DPUs)
- Our work:
  - Introduction to UPMEM programming model and PIM architecture
  - Microbenchmark-based characterization of the DPU
  - Benchmarking and workload suitability study
- Main contributions:
  - Comprehensive characterization and analysis of the first commercially-available PIM architecture
  - **PrIM** (<u>Pr</u>ocessing-<u>I</u>n-<u>M</u>emory) benchmarks:
    - 16 workloads that are memory-bound in conventional processor-centric systems
    - Strong and weak scaling characteristics
  - Comparison to state-of-the-art CPU and GPU
- Takeaways:
  - Workload characteristics for PIM suitability
  - Programming recommendations
  - Suggestions and hints for hardware and architecture designers of future PIM systems
  - PrIM: (a) programming samples, (b) evaluation and comparison of current and future PIM systems

## **System Organization**

- A UPMEM DIMM contains 8 or 16 chips
  - Thus, 1 or 2 ranks of 8 chips each
- Inside each PIM chip there are:
  - 8 64MB banks per chip: Main RAM (MRAM) banks
  - 8 DRAM Processing Units (DPUs) in each chip, 64 DPUs per rank



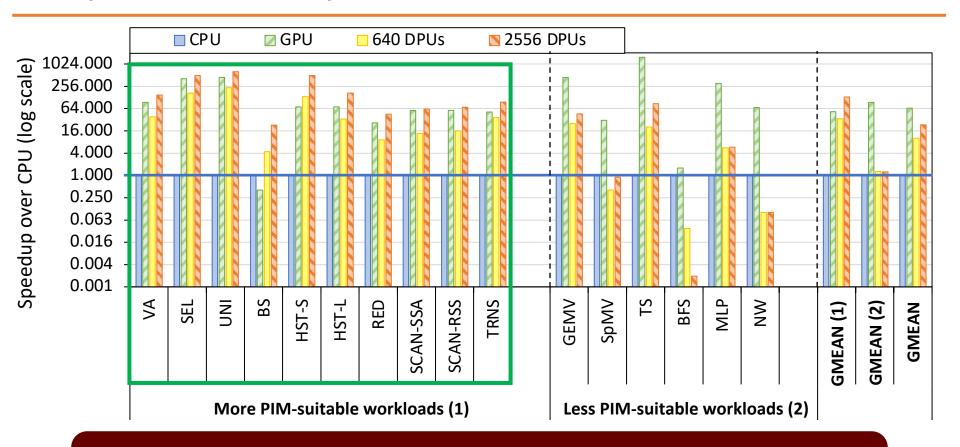


The throughput saturation point is as low as ¼ OP/B, i.e., 1 integer addition per every 32-bit element fetched

Operational Intensity (OP/B)

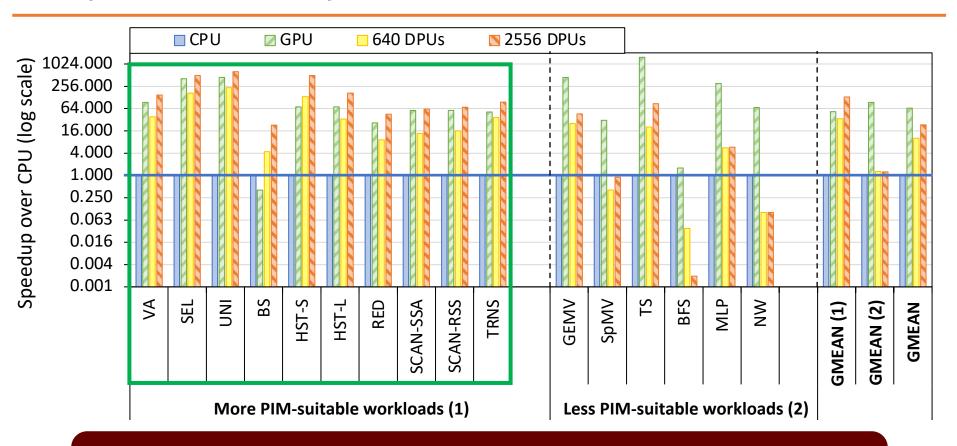
#### KEY TAKEAWAY 1

The UPMEM PIM architecture is fundamentally compute bound. As a result, the most suitable workloads are memory-bound.



#### KEY TAKEAWAY 2

The most well-suited workloads for the UPMEM PIM architecture use no arithmetic operations or use only simple operations (e.g., bitwise operations and integer addition/subtraction).



#### KEY TAKEAWAY 3

The most well-suited workloads for the UPMEM PIM architecture require little or no communication across DPUs (inter-DPU communication).

#### KEY TAKEAWAY 4

- UPMEM-based PIM systems outperform state-of-the-art CPUs in terms of performance and energy efficiency on most of PrIM benchmarks.
- UPMEM-based PIM systems **outperform state-of-the-art GPUs on a majority of PrIM benchmarks**, and the outlook is even more positive for future PIM systems.
- UPMEM-based PIM systems are more energy-efficient than stateof-the-art CPUs and GPUs on workloads that they provide performance improvements over the CPUs and the GPUs.

### **Understanding a Modern PIM Architecture**

## Understanding a Modern Processing-in-Memory Architecture: Benchmarking and Experimental Characterization

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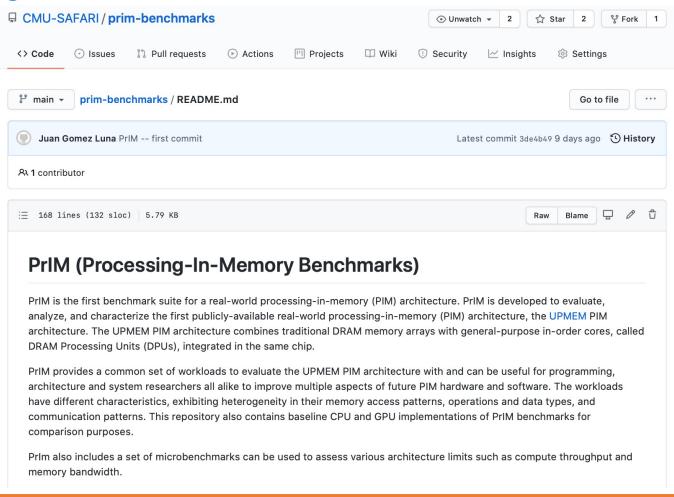
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## **PrIM Repository**

- All microbenchmarks, benchmarks, and scripts
- https://github.com/CMU-SAFARI/prim-benchmarks



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