Po-An Tsai October 2023

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RESEARCH INTERESTS

Computer system and architecture. Domain-specific (ML/DL) architecture. Accelerator modeling and prototyping. Memory hierarchy design. SW/HW co-optimization.

**EDUCATION** 

**Ph.D. in Computer Science**, June 2015 - June 2019

Massachusetts Institute of Technology

• Advisor: Professor Daniel Sanchez

• Thesis: Redesigning the Memory Hierarchy to Exploit Static and Dynamic Application Information

• Minor: Optimization Methods

S.M. in Computer Science, June 2015

Massachusetts Institute of Technology

Advisor: Professor Daniel Sanchez

• Thesis: Reducing Data Movement in Multicore Chips with Computation and Data Co-scheduling

**B.S. in Electrical Engineering**, June 2012

National Taiwan University (NTU), Taiwan

HONORS AND AWARDS Distinguished Artifact Award, MICRO-55, 2022

IEEE Micro Top Picks Award, 2021

Best Paper Nominee, HPCA-21, 2015

Best Poster Award, MIT Industry-Academia Partnership Workshop – MIT, 2014

Jacobs Presidential Fellowship – MIT, 2013

Valedictorian - NTUEE, 2012

Presidential Award – NTU, 2010, 2011, 2012

Second Prize, NTUEE Undergraduate Research Award - NTU, 2012

Star Futures Award, Altera International FPGA Design Contest - China, 2011

WORK EXPERIENCE **Sr. Research Scientist**, July 2022 – Current **Research Scientist**, July 2019 – June 2022

Architecture Research Group, NVIDIA

- Contribute to multiple generations of the hardware and software design for NVIDIA Tensor Cores
- Co-lead research activities on hardware acceleration for autonomous machines
- Worked on a flexible tensor accelerator that leverages a hierarchical and configurable data delivery network to adapt to a variety of GEMM and CNN workloads (US Patent 17/343582, 17/343597).
- Contributed to an open-sourced tool (Timeloop+Accelergy) for rapid evaluation of DNN accelerators.
- Worked on analytical modeling methodology for sparse tensor accelerators (MICRO-55).
- Worked on DARPA SDH program Developing Software-Defined Hardware that enables near ASIC performance with high programmability for data-intensive algorithms.

**Research Assistant**, September 2013 – May 2019 Computation Structure Group, MIT, Cambridge MA

Object-based memory hierarchies:

- Hotpads (MICRO-51): designed an object-based memory hierarchy designed from the ground up for modern, memory-safe languages. Hotpads reduces memory hierarchy energy by 2.6×.
- Zippads (**ASPLOS-24**): designed a compressed memory hierarchy for object-based programs. Zippads reduces main memory footprint by 2× while improving performance by 30%.

### **Software-defined memory hierarchies:**

- Jenga (ISCA-44): designed a software-defined, heterogeneous memory hierarchy that adapts to the need of applications. Jenga improves full-system EDP by 23% on average and by up to 85%.
- AMS (MICRO-51): proposed an analytical model and scheduling algorithms for systems with near-data processing (NDP) capabilities. AMS improves performance by up to 37%.
- Nexus (PACT-26): developed an asymptotically better data replication policy for distributed shared caches. Nexus improves performance by 23% on average for replication-sensitive workloads.

**Ph.D. Intern**, Summer 2015

Distributed Resource Management Team, VMware, Palo Alto CA

- Manager: Lan Gao Mentor: Rean Griffith and Sahan Gamage
- Developed and prototyped a VM scheduler that performs multi-dimensional resource balancing and traffic engineering which reduces the runtime overhead by 10× while improving utilization by 5%.
- The proposed algorithm is implemented in the 2016 release and filed as a US patent (US 15283274).

#### **PUBLICATIONS**

## RM-STC: Row-Merge Dataflow Inspired GPU Sparse Tensor Core for Energy-Efficient Sparse Acceleration

Guyue Huang, Zhengyang Wang, Po-An Tsai, Chen Zhang, Yufei Ding, Yuan Xie

The 56th IEEE/ACM International Symposium on Microarchitecture (MICRO-56), October 2023.

## HighLight: Efficient and Flexible DNN Acceleration with Hierarchical Structured Sparsity

Yannan Nellie Wu, **Po-An Tsai**, Saurav Muralidharan, Angshuman Parashar, Vivienne Sze, Joel Emer The 56th IEEE/ACM International Symposium on Microarchitecture (MICRO-56), October 2023.

## Accelerating Sparse Data Orchestration via Dynamic Reflexive Tiling

Toluwanimi O Odemuyiwa, Hadi Asghari-Moghaddam, Michael Pellauer, Kartik Hegde, **Po-An Tsai**, Neal C Crago, Aamer Jaleel, John D Owens, Edgar Solomonik, Joel S Emer, Christopher W Fletcher The 28th ACM International Conference on Architectural Support for Programming Languages and Operating Systems (ASPLOS-28), March 2023.

## **Demystifying Map Space Exploration for NPUs**

Sheng-Chun Kao, Angshuman Parashar, Po-An Tsai, Tushar Krishna

2022 IEEE International Symposium on Workload Characterization (IISWC), November 2022.

## Sparseloop: An Analytical Approach To Sparse Tensor Accelerator Modeling

Yannan Nellie Wu, Po-An Tsai, Angshuman Parashar, Vivienne Sze, Joel S Emer

The 55th IEEE/ACM International Symposium on Microarchitecture (MICRO-55), October 2022.

# SIMD<sup>2</sup>: A Generalized Matrix Instruction Set for Accelerating Tensor Computation beyond GEMM Yunan Zhang, Po-An Tsai, Hung-Wei Tseng

The 49th Annual International Symposium on Computer Architecture (ISCA-49), June 2022.

### Ruby: Improving Hardware Efficiency for Tensor Algebra Accelerators Through Imperfect Factorization

Mark Horeni, Pooria Taheri, Po-An Tsai, Angshuman Parashar, Joel Emer, Siddharth Joshi

IEEE International Symposium on Performance Analysis of Systems and Software, May 2022.

## Union: A Unified HW-SW Co-Design Ecosystem in MLIR for Evaluating Tensor Operations on Spatial Accelerators

Geonhwa Jeong, Gokcen Kestor, Prasanth Chatarasi, Angshuman Parashar, **Po-An Tsai**, Sivasankaran Rajamanickam, Roberto Gioiosa, and Tushar Krishna

The 30th International Conference on Parallel Architectures and Compilation Techniques (PACT-30), September 2021.

#### **Leaking Secrets through Compressed Caches**

**Po-An Tsai**, Andres Sanchez, Christopher W. Fletcher, and Daniel Sanchez.

IEEE Micro's Top Picks from the Computer Architecture Conferences, May/June 2021.

### Mind Mappings: Enabling Efficient Algorithm-Accelerator Mapping Space Search

Kartik Hegde, **Po-An Tsai**, Sitao Huang, Vikas Chandram, Angshuman Parashar, and Christopher W. Fletcher.

The 25th International Conference on Architectural Support for Programming Languages and Operating Systems, (ASPLOS-26), April 2021.

## Sparseloop: An Analytical, Energy-Focused Design Space Exploration Methodology for Sparse Tensor Accelerators

Yannan Nellie Wu, Po-An Tsai, Angshuman Parashar, Vivienne Sze, Joel S. Emer

IEEE International Symposium on Performance Analysis of Systems and Software, March 2021

## Hardware Abstractions for Targeting EDDO Architectures with the Polyhedral Model

Angshuman Parashar, Prasanth Chatarasi, and Po-An Tsai.

International Workshop on Polyhedral Compilation Techniques (IMPACT), January 2021.

#### Safecracker: Leaking Secrets through Compressed Caches

**Po-An Tsai**, Andres Sanchez, Christopher W. Fletcher, and Daniel Sanchez.

The 25th International Conference on Architectural Support for Programming Languages and Operating Systems, (ASPLOS-25), March 2020.

### Compress Objects, Not Cache Lines: An Object-Based Compressed Memory Hierarchy

**Po-An Tsai** and Daniel Sanchez.

The 24th International Conference on Architectural Support for Programming Languages and Operating Systems, (ASPLOS-24), April 2019.

## Rethinking the Memory Hierarchy for Modern Languages

Po-An Tsai, Yee Ling Gan, and Daniel Sanchez.

The 51st International Symposium on Microarchitecture (MICRO-51), October 2018.

### Adaptive Scheduling for Systems with Asymmetric Memory Hierarchies

**Po-An Tsai**, Changping Chen, and Daniel Sanchez.

The 51st International Symposium on Microarchitecture (MICRO-51), October 2018.

## KPart: A Hybrid Cache Partitioning-Sharing Technique for Commodity Multicores

Nosayba El-Sayed, Anurag Mukkara, **Po-An Tsai**, Harshad Kasture, Xiaosong Ma, and Daniel Sanchez. The 24th Intl. Symposium on High Performance Computer Architecture (HPCA-24), February 2018.

## Nexus: A New Approach to Replication in Distributed Shared Caches

Po-An Tsai, Nathan Beckmann, and Daniel Sanchez.

The 26th International Conference on Parallel Architectures and Compilation Techniques (PACT-26), September 2017.

### Jenga: Software-Defined Cache Hierarchies

Po-An Tsai, Nathan Beckmann, and Daniel Sanchez.

The 44th International Symposium on Computer Architecture (ISCA-44), June 2017.

## Scaling Distributed Cache Hierarchies with Computation and Data Co-Scheduling

Nathan Beckmann, Po-An Tsai, and Daniel Sanchez.

The 21st International Symposium on High Performance Computer Architecture (HPCA-21), February 2015. Nominated for the best paper award

## Hybrid Path-Diversity-Aware Adaptive Routing with Latency Prediction Model in Network-on-Chip Systems

Po-An Tsai, Yu-Hsin Kuo, En-Jui Chang, and An-Yeu Wu.

International Symposium on VLSI Design, Automation & Test, (VLSI-DAT), March 2013.

### Path-Diversity-Aware Adaptive Routing in Network-on-Chip Systems

Yu-Hsin Kuo, **Po-An Tsai**, Hao-Ping Ho, En-Jui Chang, Hsien-Kai Hsin, and An-Yeu Wu. The 6th International Symposium on Embedded Multicore SoCs (MCSoC), September 2012.

#### PATENT

#### Resource-Based Virtual Computing Instance Scheduling

US Patent 15283274

Po-An Tsai, Sahan Gamage, and Rean Griffith.

#### Flexible Accelerator for a Tensor Workload

US Patent 17343597,17343582

Po-An Tsai, Neal Crago, Angshuman Parashar, Joel Springer Emer, Stephen William Keckler

## Pruning and accelerating neural networks with hierarchical fine-grained structured sparsity

US Patent 17681967

Yannan Wu, Po-An Tsai, Saurav Muralidharan, Joel Springer Emer

### SKILLS AND TOOLS

Programming languages and projects:

- C, C++: Analytical modeling tool for DNN accelerators (Timeloop), Event-driven multicore-processor simulator (Zsim)
- Python, PyTorch: Fine-tuning and accelerating sparse DNNs
- Verilog: FPGA-accelerated augmented-reality system, FPGA-accelerated medical image processing
- CUDA, OpenCL: GPGPU-assisted ultra-sonic array imaging system
- Java: Extending Maxine VM, a meta-circular JVM implementation for research
- Python, Matlab: Data analysis for predicting earning potential on an adult dataset
- Python, HTML, Javascript: Searchable and encrypted remote file system

Libraries: CUDA, OpenCL, matplotlib, Pytorch, TensorFlow

Tools: Git, Intel Pin, Timeloop, Zsim, ModelSim, Altera Quantus II, IC Encounter

#### **SERVICE**

- Program Committee Member, ISMM'20, HPCA'21, MICRO'22.
- External Review Committee Member, PACT'20, MICRO'20, MICRO'21, ASPLOS'22, ISCA'22, ISCA'23.
- Artifact Evaluation Co-Chair, ISCA'23.
- Organizer, Workshop on Democratizing Domain-Specific Accelerators @ MICRO'22, MICRO'23
- Workshop/Tutorial Co-Chair, HPCA'21.

- Tutorial Organizer for Timeloop/Accelergy Tutorial: Tools for Evaluating Deep Neural Network Accelerator Designs, MICRO'19, ISCA'20, ISPASS'20.
- Submissions Co-Chair, MICRO-50, 2017
- President, 2014-2015, Taiwanese student association at MIT.