# Tae Jun Ham

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CURRENT Seoul National University, Seoul, Republic of Korea

July. 2018 - Present

Position Postdoctoral Researcher

Research Area: Software-hardware co-design for emerging applications such as big data analytics and machine learning.

Supervisor: Professor Jae W. Lee

This position also fulfills the **mandatory military service duty** required for all Korean men.

#### EDUCATION **Princeton University**, Princeton, NJ USA

Sep. 2012 - Jun. 2018

School of Engineering and Applied Science

**Ph.D** in Electrical Engineering **M.A** in Electrical Engineering

Dissertation: Data Access Optimization in Accelerator-oriented Heterogeneous Architecture through Decoupling and

Memory Hierarchy Specialization

Advisor: Professor Margaret Martonosi and Professor Juan Luis Aragon

# Duke University, Durham, North Carolina USA

Aug. 2009 - Dec. 2011

Pratt School of Engineering

**B.S.E** in Electrical and Computer Engineering (GPA: 3.95/4.00)

Summa Cum Laude, with Distinction in Electrical and Computer Engineering

# Publications [FAST '21] FlashNeuron: SSD Enables Large-Batch Training of Very Deep Neural Networks

Jonghyun Bae, Jongsung Lee, Yunho Jin, Sam Son, Shine Kim, Hakbeom Jang, Tae Jun Ham, Jae W. Lee

USENIX Conference on File and Storage Technologiess (FAST), 2021 [To Appear]

Acceptance Rate :  $28/130 \approx 21\%$ 

### [FAST '21] Behemoth: A Flash-centric Training Accelerator for Extreme-scale DNNs

Shine Kim, Yunho Jin, Gina Sohn, Jonghyun Bae, Tae Jun Ham, Jae W. Lee

USENIX Conference on File and Storage Technologiess (FAST), 2021 [To Appear]

Acceptance Rate :  $28/130 \approx 21\%$ 

## [ASPLOS '21] MERCI: Efficient Embedding Reduction on Commodity Hardware via Sub-Query Memoization

Yejin Lee, Seong Hoon Seo, Hyunji Choi, Hyoung Wook Sul, Soosung Kim, Jae W. Lee, **Tae Jun Ham (Corresponding Author)** 

The 26th ACM International Conference on Architectural Support for Programming Languages and Operating Systems (ASPLOS), 2021 [To Appear]

Acceptance Rate :  $75/398 \approx 19\%$ 

# [HPCA '21] Layerweaver: Maximizing Resource Utilization of Neural Processing Units via Layer-Wise Scheduling

Young H. Oh, Seonghak Kim, Yunho Jin, Sam Son, Jonghyun Bae, Jongsung Lee, Yeonhong Park, Dong Uk Kim, **Tae Jun Ham**, Jae W. Lee

The 27th IEEE International Symposium on High-Performance Computer Architecture (HPCA), 2021 [To Appear]

Acceptance Rate :  $63/258 \approx 24\%$ 

### [ICCAD '20] Unlocking Wordline-level Parallelism for Fast Inference on RRAM-based DNN Accelerator

Yeonhong Park, Seung Yul Lee, Hoon Shin, Jun Heo, Tae Jun Ham, Jae W. Lee

The 39th IEEE/ACM International Conference on Computer-Aided Design (ICCAD), 2020

Acceptance Rate :  $127/470 \approx 27\%$ 

# [MICRO '20] Graphene: Strong yet Lightweight Row Hammer Protection

Yeonhong Park, Woosuk Kwon, Eojin Lee, Tae Jun Ham, Jung Ho Ahn, Jae W. Lee

The 53rd IEEE/ACM International Symposium on Microarchitecture (MICRO), 2020

Acceptance Rate :  $82/424 \approx 19\%$ 

### • IEEE Micro Top Picks Honorable Mention

## [ISCA '20] Genesis: A Hardware Acceleration Framework for Genomic Data Analysis

**Tae Jun Ham**, David Bruns-Smith, Brendan Sweeney, Yejin Lee, Seong Hoon Seo, U Gyeong Song, Young H. Oh, Krste Asanovic, Jae W. Lee, Lisa Wu

The 47th ACM/IEEE International Symposium on Computer Architecture (ISCA), 2020

Acceptance Rate :  $77/428 \approx 18\%$ 

### • IEEE Micro Top Picks

# [ISCA '20] A Case for Hardware-based Demand Paging

Gyusun Lee\*, Wenjing Jin\*, Wonsuk Song, Jeonghun Gong, Jonghyun Bae, Tae Jun Ham, Jae W. Lee, Jinkyu Jeong

The 47th ACM/IEEE International Symposium on Computer Architecture (ISCA), 2020

Acceptance Rate :  $77/428 \approx 18\%$ 

\* Two authors contributed equally.

### [ISCA '20] A Specialized Architecture for Object Serialization with Applications to Big Data Analytics

Jaeyoung Jang, Sung Jun Jung, Sunmin Jeong, Jun Heo, Hoon Shin, Tae Jun Ham, Jae W. Lee

The 47th ACM/IEEE International Symposium on Computer Architecture (ISCA), 2020

Acceptance Rate :  $77/428 \approx 18\%$ 

## [ISPASS '20] MosaicSim: A Lightweight, Modular Simulator for Heterogeneous Systems

Opeoluwa Matthews, Aninda Manocha, Davide Giri, Marcelo Orenes-Vera, Esin Tureci,

Tyler Sorensen, Tae Jun Ham, Juan Luis Aragon, Luca P. Carloni, Margaret Martonosi

IEEE International Symposium on Performance Analysis of Systems and Software (ISPASS), 2020

Acceptance Rate :  $25/73 \approx 34\%$ 

### • Nominated for the Best Paper Award

#### [ASPLOS '20] IIU: Specialized Architecture for Inverted Index Search

Jun Heo, Jaeyeon Won, Yejin Lee, Shivam Bharuka, Jaeyoung Jang, Tae Jun Ham, Jae W. Lee

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

Acceptance Rate :  $86/476 \approx 18\%$ 

### [HPCA '20] A<sup>3</sup>: Accelerating Neural Network Attention Mechanism with Approximation

**Tae Jun Ham**, Sung Jun Jung, Seonghak Kim, Young H. Oh, Yeonhong Park, Yoonho Song, Jung-Hun Park, Sanghee Lee, Kyoung Park, Jae W. Lee, Deog-Kyoon Jeong

The 26th IEEE International Symposium on High Performance Computer Architecture (HPCA), 2020

Acceptance Rate :  $48/235 \approx 20\%$ 

## [MICRO '19] Charon: Specialized Near-Memory Processing Architecture for Clearing Dead Objects in Memory

Jaeyoung Jang, Jun Heo, Yejin Lee, Jaeyeon Won, Seonghak Kim, Sung Jun Jung, Hakbeom Jang, **Tae Jun Ham**, Jae W. Lee

The 52nd IEEE/ACM International Symposium on Microarchitecture (MICRO), 2019

Acceptance Rate :  $79/343 \approx 23\%$ 

# [IEEE Micro] SSDStreamer: Specializing I/O Stack for Large-Scale Machine Learning

Jonghyun Bae, Hakbeom Jang, Jeonghun Gong, Wenjing Jin, Shine Kim, Jaeyoung Jang, **Tae Jun Ham**, Jinkyu Jeong, Jae W. Lee

IEEE Micro, September 2019

## [ATC '19] Asynchronous I/O Stack: A Low-latency Kernel I/O Stack for Ultra-Low Latency SSDs

Gyusun Lee, Seokha Shin, Wonsuk Song, Tae Jun Ham, Jae W. Lee, Jinkyu Jeong

USENIX Annual Technical Conference (ATC), 2019

Acceptance Rate :  $71/356 \approx 20\%$ 

### [ATC '19] Practical Erase Suspension for Modern Low-latency SSDs

Shine Kim, Jonghyun Bae, Hakbeom Jang, Wenjing Jin, Jeonghun Gong, Seungyeon Lee, Tae Jun Ham, Jae W. Lee

USENIX Annual Technical Conference (ATC), 2019

Acceptance Rate :  $71/356 \approx 20\%$ 

### [ACM TACO] Efficient Data Supply for Parallel Heterogeneous Architectures

Tae Jun Ham, Juan L Aragon, Margaret Martonosi

ACM Transactions on Architecture and Code Optimization (TACO), June 2019

• Presented on HiPEAC 2020 Conference

# [ACM TACO] Decoupling Data Supply from Computation for Latency-Tolerant Communication in Heterogeneous Architectures

Tae Jun Ham, Juan L Aragon, Margaret Martonosi

ACM Transactions on Architecture and Code Optimization (TACO), June 2017

# [MICRO '16] Graphicionado: A High-Performance and Energy-Efficient Accelerator for Graph Analytics

Tae Jun Ham, Lisa Wu, Narayanan Sundaram, Nadathur Satish, Margaret Martonosi

The 49th IEEE/ACM International Symposium on Microarchitecture (MICRO), 2016

Acceptance Rate :  $61/283 \approx 22\%$ 

• MICRO-49 Best Paper Award

# [MICRO '15] DeSC: Decoupled Supply-Compute Communication Management for Heterogeneous Architectures

Tae Jun Ham, Juan L Aragon, Margaret Martonosi

The 48th IEEE/ACM International Symposium on Microarchitecture (MICRO), 2015

Acceptance Rate :  $61/283 \approx 22\%$ 

- IEEE Micro's Top Picks from the Computer Architecture Honorable Mention (Top 23 Computer Architecture Papers of 2015)
- Motivated \$5.8million DARPA-funded DECADES project (https://decades.cs.princeton.edu/)

# [HPCA '13] Disintegrated Control for Energy-Efficient and Heterogeneous Memory Systems

Tae Jun Ham, Bharath K. Chelepalli, Neng Xue, Benjamin C. Lee

The 19th IEEE International Symposium on High Performance Computer Architecture (HPCA), 2013

Acceptance Rate :  $51/249 \approx 20\%$ 

### WORK Microsoft Research, Cambridge, UK

EXPERIENCE Graduate Research Intern May - Aug, 2016

Research on an efficient secure memory design with near-data computation

# Intel Labs — Parallel Computing Lab, Santa Clara, USA

Graduate Technical Intern May - Nov, 2015

Research on a custom hardware accelerator for graph analytics applications.

### AMD Research, Austin, USA

Co-op Engineer Jun - Aug, 2013

Research on an efficient use of high-perf energy-efficient heterogeneous system consists of large, low memory bandwidth processors and small, high memory bandwidth processors.

#### Samsung Advanced Institute of Technology, Yongin, Republic of Korea

Research Intern

Jun - Aug, 2012

Research on a GPU branch divergence problem.

**Duke University** — BCL Research Group, Durham, USA

Research Assistant Jan - May, 2012

Research on a heterogeneous memory system.

Honors and Awards

- IEEE MICRO Top Picks (2021)
- IEEE MICRO Top Picks Honorable Mention (2021)
- ISPASS Best Paper Award Nominee (2020)
- MICRO-49 Best Paper Award (2016)
- IEEE MICRO Top Picks Honorable Mention(2016)
- Facebook Graduate Fellowship Finalist (2016-2017), Facebook, Inc.
- Gordon Y.S. Wu Fellowship (2012-2017), Princeton University
- Samsung Scholarship (2012-2017), Scholarship that supports up to \$50,000 per year
- Summa Cum Laude, Duke University

Computer

- Languages: C/C++, CUDA, Python, Chisel, Verilog, Matlab, R
- Applications/Frameworks: PyTorch, Numpy, SciPy, Pandas, Intel Pin, LLVM, Cadence C-to-Silicon, LTeX

#### **PATENTS**

SKILLS

# Instruction, Circuits, and Logic for Graph Analytics Acceleration

(US20170286122A1; WO/2017/172173)

with Lisa Wu, Nadathur Satish and Narayanan Sundaram

# Method For Accelerating Candidate Selection based on Similarity and Accelerator for Performing Candidate Selection (Pending - Application No. 16/270.054)

with Jae W. Lee, Deog-Kyoon Jeong, Seonghak Kim, Sung Jun Jung, and Minsoo Lim

# Hardware Accelerator Performing Search using Inverted Index Structure and Search System Including the Hardware Accelerator (Pending - Application No. 17/118.085)

with Jae W. Lee, Jun Heo, Jaeyeon Won, and Yejin Lee

### Hardware-based Demand Paging Technique (Pending - Application No. 16/950,370)

with Jinkyu Jeong, Jae W. Lee, Gyusun Lee, and Wenjing Jin

# Scheduler, Method for Operating the Same and Neural Network Accelerator System Including the Same (Pending)

with Jae W. Lee, Young H. Oh, and Seonghak Kim

# Input-Aware Current Compensation for Reliable NVM Crossbar based In-Memory Computing (Pending)

with Jae W. Lee, Yeonhong Park, Seungyul Lee, Hoon Shin, and Jun Heo

# Method for Operating the same, and Electronic Device including the same (for efficient quantized matrix multiplications)

(Pending)

with Jae W. Lee, Jaeyeon Won, and Seungwook Lee

## RESEARCH MENTORING

I closely work with these students and supervise their work (along with their primary supervisor Jae W. Lee) through frequent (often more than once a week) meetings with each group of students. I provide advices and help on research, technical implementation, and writing.

#### **Past Mentees**

 Jaeyoung Jang, Ph.D from Sungkyunkwan University Now at Samsung Electronics Jul 2018 - Jan 2020

#### **Graduate Students**

Graduate Students	
• Young H. Oh, Ph.D Student at Sungkyunkwan University	Jul 2018 - Present
• Jun Heo, Ph.D Student at Seoul National University	Jul 2018 - Present
• Jonghyun Bae, Ph.D Student at Seoul National University	Sep 2018 - Present
• Shine Kim, Ph.D Student at Seoul National University	Sep 2018 - Present
Wenjing Jin, Ph.D Student at Seoul National University	Sep 2018 - Present
• Sung Jun Jung, M.S/Ph.D Student at Seoul National University	Sep 2018 - Present
Yejin Lee, M.S/Ph.D Student at Seoul National University	Jan 2019 - Present
• Yeonhong Park, M.S/Ph.D Student at Seoul National University	Jun 2019 - Present
• Yunho Jin, M.S/Ph.D Student at Seoul National University	Jun 2019 - Present
• Sam Son, M.S/Ph.D Student at Seoul National University	Jun 2019 - Present
• Seung Yul Lee, M.S/Ph.D Student at Seoul National University	Jun 2019 - Present
• Seong Hoon Seo, M.S/Ph.D Student at Seoul National University	Jun 2019 - Present
• Soosung Kim, M.S/Ph.D Student at Seoul National University	Jan 2020 - Present

# **Undergraduate Students**

 Jaeyeon Won, Undergraduate at Seoul National University Now a Ph.D student at MIT.

• Wookyung Song, Undergraduate at Seoul National University

# Jan 2019 - Aug 2019

May 2020 - Aug 2020 Jun 2019 - Aug 2019

# Professional Paper Reviews

#### ACTIVITIES

- IEEE Transactions on Very Large Scale Integration Systems (TVLSI) 2015
- IEEE Transactions on Mobile Computing (TMC) 2016
- IEEE Transactions on Computer (TC) 2017, 2018, 2020
- IEEE Computer Architecture Letters (CAL) 2018
- IEEE Micro 2019
- ACM International Conference on Architectural Support for Programming Languages and Operating Systems (ASPLOS) - 2017
- ACM/IEEE International Symposium on Computer Architecture (ISCA) 2020
- ACM Transactions on Architecture and Code Optimization (TACO) 2014
- ACM Transactions on Parallel Computing (TOPC) 2019
- Elsevier Future Generation Computer Systems (FGCS) 2019

#### **Invited Talks**

• KAIST, POSTECH (Sep 2017)

DeSC: Decoupling Data Supply from Computation for Latency-Tolerant Communication in Heterogeneous Architectures

• DARPA HIVE PI Meeting (Oct 2017)

Graphicionado: A High-Performance and Energy-Efficient Accelerator for Graph Analytics

• HiPEAC 2020 (Jan 2020)

Efficient Data Supply for Parallel Heterogeneous Architectures

• Seoul National University AI Summer School (Aug 2020)

Accelerating Neural Network Attention Mechanism with HW/SW Codesign

• POSTECH Summer AI Seminar (Aug 2020)

Hardware/Software Co-design for Modern AI and Data Analytics Applications

#### Services

- External Review Committee Member, ACM International Conference on Architectural Support for Programming Languages and Operating Systems (ASPLOS '19)
- Web Chair, ACM International Symposium on Code Generation and Optimization (CGO '21)