# Zishen Wan

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### **RESEARCH INTERESTS**

Research Areas: Computer Architecture, VLSI, Autonomous Machine, EDA, Embedded System

**Research Vision:** My research is at the intersection of VLSI, computer architecture, and embedded systems. I build hardware and system for autonomous machines and edge intelligence through cross-stack software-hardware co-design, with the vision to advance their performance, efficiency, resilience, and robustness.

## **EDUCATION**

#### 2020-2025 Georgia Institute of Technology, Atlanta, GA, USA

(Expected) Ph.D., School of Electrical and Computer Engineering (ECE)

- Advisor: Prof. Arijit Raychowdhury
- Research Topic: Efficient and Reliable Hardware and System Design for Edge Intelligence
- *GPA*: 4.0/4.0

#### 2018-2020 Harvard University, Cambridge, MA, USA

M.S., School of Engineering and Applied Science (SEAS)

- Advisor: Prof. Vijay Janapa Reddi
- Research Topic: Reliability and Design Automation of Autonomous Machines
- GPA: 3.95/4

### 2014-2018 Harbin Institute of Technology (HIT), Harbin, China

B.E. with High Honors, Department of Electrical Engineering (EE)

• *GPA*: 93.5/100 (Rank: 2/230)

## PERFESSIONAL EXPERIENCE

2020- Georgia Institute of Technology, Atlanta, GA, USA

Graduate Research Assistant

2018-2020 Harvard University, Cambridge, MA, USA

Graduate Research Assistant

2018 Massachusetts Institute of Technology, Cambridge, MA, USA

Graduate Research Assistant

2016-2018 Harbin Institute of Technology, Harbin, China

Undergraduate Research Assistant

2017 National Tsing-Hua University, Hsinchu, Taiwan

Visiting Student

2017 National Chiao-Tung University, Hsinchu, Taiwan

Visiting Student

## SELECTED AWARDS AND HONORS

Roger P. Webb Graduate Research Assistant Excellence Award, Georgia Tech
Recognition of Graduate Research Assistant (GRA) who have demonstrated excellent
research performance. 2-4 students each year in Georgia Tech School of ECE.
IEEE Micro Top Picks, Honorable Mention
Recognition of "the most significant research papers in computer architecture based
on novelty and potential for long-term impact, published in the top computer architecture conferences of 2022"

2022 1st Place, ACM/SIGBED Student Research Competition

Ranked 1st of 30 participants in ACM student research competition at Embedded Systems Week (ESWEEK), will represent SIGBED to compete in ACM Grand Finals.

- 2022 3<sup>rd</sup> Place, ACM/SIGDA Student Research Competition (declined) Ranked 3<sup>rd</sup> of 40 participants in ACM student research competition at International Conference on Computer-Aided Design (ICCAD).
- 2022 **Qualcomm Fellowship**
- 2022 Young Fellow, ACM/IEEE Design Autonomation Conference (DAC)
- 2022 **CRNCH PhD Fellowship**, Center for Novel Computing Hierarchies, Georgia Tech 2-4 graduate students each year in Georgia Tech College of Engineering and College of Computing
- 2021 Best Research Video Award, DAC Young Fellow Program 25 winners out of ~200 DAC young fellow students
- 2021 Young Fellow, ACM/IEEE Design Autonomation Conference (DAC)
- 4th Place, ACM Student Research Competition at International Conference on Computer-Aided Design (ICCAD)
- 2020 **Best Paper Award** in IEEE Computer Architecture Letter (CAL) Paper ranked highest among 42 accepted papers that year
- 2020 Best Paper Award in ACM/IEEE Design Autonomation Conference (DAC) Paper ranked highest among 228 accepted papers out of 984 submissions that year
- 2020 **Dean's Fellowship**, Purdue University

2 winners out of over 1600 worldwide applicants, declined

**Chiang Chen Overseas Graduate Scholarship** 2018

10 of all undergraduates and graduates in China, \$50,000/person

2018 Best Undergraduate Thesis Award, HIT

100 winners out of ~4000 thesis submissions

- 2018 First Class of Chunhui Innovation Achievement Award
  - 3 of all undergraduates in HIT, highest student academic honor in HIT
- 2018 China Telecom Scholarship

5 of all undergraduates and graduates in HIT

2018 Outstanding Graduates, HIT

*Top 1% of all undergraduates* 

- 2017 Innovation and Entrepreneurship Scholarship, Ministry of Industry and Information,
- 2016 First Prize, National Undergraduate Mathematical Contest in Modeling, China Team leader, 294 winners out of ~32000 teams, ranked highest among ~600 HIT
- 2016 **Siemens Academic Scholarship**

30 of all undergraduates and graduates in HIT

- 2016 Outstanding Student of Heilongjiang Province, China Top 1% of all undergraduates
- 2015 Johnson Electric Academic Scholarship

15 of all undergraduates and graduates in HIT

2015-2017 First Class Academic Excellence Scholarship, HIT

### Top 3% of all undergraduates

#### **PUBLICATIONS**

(\* Indicates Equal Contributions)

### **Book**

Synthesis "Robotic Computing on FPGAs"

**Lectures on** Shaoshan Liu, Zishen Wan, Bo Yu, Yu Wang

**Computer** In Synthesis Lectures on Computer Architecture (Morgan & Claypool Publishers), pp. 1-

Architecture 218, Jun 2021

#### **Conference Publications**

DAC 2023 "BERRY: Bit Error Robustness for Energy-Efficient Reinforcement Learning-Based Autonomous Systems"

> Zishen Wan, Nandhini Chandramoorthy, Karthik Swaminathan, Pin-Yu Chen, Vijay Janapa Reddi, Arijit Ravchowdhury

To appear in ACM/IEEE Design Automation Conference (DAC), July 2023 Acceptance Rate: 23%

**DATE 2023** "Real-Time Fully Unsupervised Domain Adaptation for Lane Detection in Autonomous Driving"

Kshitij Bhardwaj, Zishen Wan, Arijit Raychowdhury, Ryan Goldhahn

To appear in Design, Automation and Test in Europe Conference (DATE), March 2023 Acceptance Rate: 24%

**DATE 2023** "MAVFI: An End-to-End Fault Analysis Framework with Anomaly Detection and Recovery for Micro Aerial Vehicles"

> Yu-Shun Hsiao\*, Zishen Wan\*, Tianyu Jia, Radhika Ghosal, Abdulrahman Mahmoud Arijit Raychowdhury, David Brooks, Gu-Yeon Wei, Vijay Janapa Reddi (\*alphabetical order)

To appear in Design, Automation and Test in Europe Conference (DATE), March 2023 Acceptance Rate: 24%

**ISSCC 2023** "A 73.53TOPS/W 14.74TOPS Heterogeneous RRAM In-Memory and SRAM Near-Memory SoC for Hybrid Frame and Event-Based Target Tracking"

> Muya Chang\*, Ashwin Lele\*, Samuel Spetalnick, Brian Crafton, Shota Konna, Zishen Wan, Ashwin Bhat, Win-San Khwa, Yu-der Chih, Meng-Fan Chang, Arijit Raychowdhury In IEEE International Solid-State Circuits Conference (ISSCC), February 2023

*Acceptance Rate: 33% (205/629)* 

ICCAD 2022 "On Resilience and Robustness of Autonomous Systems"

Zishen Wan, Karthik Swaminathan, Pin-Yu Chen, Nandhini Chandramoorthy, Arijit Raychowdhury

In 41st IEEE/ACM International Conference on Computer-Aided Design (ICCAD), November 2022

MICRO 2022 "Automatic Domain-Specific SoC Design for Autonomous Unmanned Aerial Vehicles"

(Selected as Srivatsan Krishnan, Zishen Wan, Kshitij Bhardwaj, Paul Whatmough, Aleksandra Faust, **IEEE Micro** Sabrina M. Neuman, Gu-Yeon Wei, David Brooks, Vijay Janapa Reddi

**Top Picks,** In 55th IEEE/ACM International Symposium on Microarchitecture (MICRO), October Honorable 2022

**Mention**) Acceptance Rate: 22% (83/369)

"Improving Compute In-Memory ECC Reliability with Successive Correction"
Brian Crafton, Zishen Wan, Samuel Spetalnick, Jong-Hyeok Yoon, Wei Wu, Carlos Tokunaga, Vivek De, Arijit Raychowdhury
In 59th ACM/IEEE Design Automation Conference (DAC), July 2022
Acceptance Rate: 23% (231/987)

AICAS 2022 "Robotic Computing on FPGAs: Current Progress, Research Challenges, and Opportunities"

Zishen Wan, Ashwin Lele, Bo Yu, Shaoshan Liu, Yu Wang, Vijay Janapa Reddi, Cong (Callie) Hao, Arijit Raychowdhury

In IEEE International Conference on Artificial Intelligence Circuits and Systems (AICAS), June 2022

**ISPASS 2022** "Roofline Model for UAVs: A Bottleneck Analysis Tool for Onboard Compute Characterization of Autonomous Unmanned Aerial Vehicles"

Srivatsan Krishnan, <u>Zishen Wan</u>, Kshitij Bhardwaj, Ninad Jadhav, Aleksandra Faust, Vijay Janapa Reddi

In IEEE International Symposium on Performance Analysis of Systems and Software (ISPASS), June 2022

*Acceptance Rate:* 29% (24/83)

CICC 2022 "An Energy-Efficient and Runtime-Reconfigurable FPGA-Based Accelerator for Robotic Localization Systems"

Qiang Liu\*, Zishen Wan\*, Bo Yu\*, Weizhuang Liu, Shaoshan Liu, Arijit Raychowdhury In IEEE Custom Integrated Circuits Conference (CICC), April 2022
Acceptance Rate: 41% (97/235)

**DATE 2022** "FRL-FI: Transient Fault Analysis for Federated Reinforcement Learning-Based Navigation Systems"

Zishen Wan, Aqeel Anwar, Abdulrahman Mahmoud, Tianyu Jia, Yu-Shun Hsiao, Vijay Janapa Reddi, Arijit Raychowdhury

In Design, Automation and Test in Europe Conference (DATE), March 2022 Acceptance Rate: 25%

**ASP-DAC 2022** "Circuit and System Technologies for Energy-Efficient Edge Robotics" (Invited Paper) Zishen Wan, Ashwin Lele, Arijit Raychowdhury

In Asia and South Pacific Design Automation Conference (ASP-DAC), January 2022

DAC 2021 "Analyzing and Improving Fault Tolerance of Learning-Based Navigation System"

Zishen Wan, Aqeel Anwar, Yu-Shun Hsiao, Tianyu Jia, Vijay Janapa Reddi, Arijit
Raychowdhury

*In 58th ACM/IEEE Design Automation Conference (DAC), December 2021 Acceptance Rate: 23%* 

AICAS 2021 "An Energy-Efficient Quad-Camera Visual System for Autonomous Machines on FPGA Platform"

Zishen Wan\*, Yuyang Zhang\*, Arijit Raychowdhury, Bo Yu, Yanjun Zhang, Shaoshan Liu

In IEEE International Conference on Artificial Intelligence Circuits and Systems (AICAS), June 2021

AICAS 2021 "iELAS: An ELAS-Based Energy-Efficient Accelerator for Real-Time Stereo Matching on FPGA Platform"

Tian Gao\*, <u>Zishen Wan</u>\*, Yuyang Zhang, Bo Yu, Yanjun Zhang, Shaoshan Liu, Arijit Raychowdhury

In IEEE International Conference on Artificial Intelligence Circuits and Systems (AICAS), June 2021

DAC 2020 (Best Paper "Algorithm-Hardware Co-Design of Adaptive Floating-Point Encodings for Resilient Deep Learning Inference"

Award)

Thierry Tambe, En-Yu Yang, Zishen Wan, Yuntian Deng, Vijay Janapa Reddi, Alexander Rush, David Brooks, Gu-Yeon Wei

In 57th ACM/IEEE Design Automation Conference (DAC), July 2020

Acceptance Rate: 23% (228/984)

### **Journal Publications**

TMLR 2022 "Quark: Quantization for Fast and Environmentally Sustainable Reinforcement Learning"

Srivatsan Krishnan\*, Max Lam\*, Sharad Chitlangian\*, <u>Zishen Wan</u>, Gabriel Barth-Maron, Aleksandra Faust, Vijay Janapa Reddi

In Transactions on Machine Learning Research (TMLR), July 2022

CAS-M 2021 "A Survey of FPGA-Based Robotic Computing"

Zishen Wan\*, Bo Yu\*, Thomas Yuang Li, Jie Tang, Yuhao Zhu, Yu Wang, Arijit Raychowdhury, Shaoshan Liu

In IEEE Circuits and Systems Magazine (CAS-M), June 2021

CAL 2020

Award)

(Best Paper

"The Sky Is Not the Limit: A Visual Performance Model for Cyber-Physical Co-Design in Autonomous Machines"

Srivatsan Krishnan, <u>Zishen Wan</u>, Kshitij Bhardwaj, Paul Whatmough, Aleksandra Faust, Gu-Yeon Wei, David Brooks, Vijay Janapa Reddi

In IEEE Computer Architecture Letters (CAL), March 2020

**JJAP 2019** "Electrically Tunable Temporal Imaging in a Graphene-Based Waveguide"

Peng Xie, Yu Wen, Zishen Wan, Xinyu Wang, Jiarui Liu, Wenqiang Yang, Xiaofeng Li, Yishan Wang

In Japanese Journal of Applied Physics, 58(5):050914, April 2019

#### **Workshop Publications**

ICML 2022 "Multi-Task Federated Reinforcement Learning with Adversaries"

Aqeel Anwar, Zishen Wan, Arijit Raychowdhury

In International Conference on Machine Learning (ICML), Adversarial Machine Learning Workshop, July 2022

NVMW 2022 "RRAM-ECC: Improving Reliability of RRAM-Based Compute In-Memory"

Zishen Wan\*, Brian Crafton\*, Samuel Spetalnick, Jong-Hyeok Yoon, Arijit Raychowdhury

In 13th Annual Non-Volatile Memories Workshop (NVMW), May 2022

ICLR 2021 "ActorQ: Quantization for Actor-Learner Distributed Reinforcement Learning"

Max Lam\*, Sharad Chitlangian\*, Srivatsan Krishnan\*, <u>Zishen Wan</u>, Gabriel Barth-Maron, Aleksandra Faust, Vijay Janapa Reddi

In International Conference on Learning Representations (ICLR), Hardware-Aware Efficient Training Workshop, May 2021

MLSvs 2020 "Ouantized Reinforcement Learning (OuaRL)"

Srivatsan Krishnan\*, Sharad Chitlangian\*, Max Lam\*, <u>Zishen Wan</u>, Aleksandra Faust, Vijay Janapa Reddi

In Conference on Machine Learning and System (MLSys), Resource-Constrained Machine Learning Workshop, March 2020

## **Preprints**

Preprint 2021 "AutoSoC: Automating Algorithm-SoC Co-design for Aerial Robots" Srivatsan Krishnan, Thierry Tambe, Zishen Wan, Vijay Janapa Reddi arXiv preprint arXiv:2109.05683, 2021

Preprint 2019 "Adaptivfloat: A Floating-point Based Data Type for Resilient Deep Learning Inference" Thierry Tambe, En-yu Yang, Zishen Wan, Yuntian Deng, Vijay Janapa Reddi, Alexander Rush, David Brooks, Gu-Yeon Wei arXiv preprint arXiv:1909.13271, 2019

### SELECTED TALKS

- Mar 2023 "Intelligence in Robotic Computing: Exploring Agile Design Flows for Building Efficient and Resilient Autonomous Systems"

  At Georgia Tech Efficient and Intelligent Computing (EIC) Lab, Atlanta, GA, USA
- Feb 2023 "Intelligence in Robotic Computing: Exploring Agile Design Flows for Building Efficient and Resilient Autonomous Systems"

  At CRNCH (Center for Research into Novel Computing Hierarchies) Annual Summit, Atlanta, GA, USA
- Nov 2022 "Intelligence in Robotic Computing: Exploring Agile Design Flows for Building Efficient and Resilient Autonomous Systems"

  At ACM Student Research Competition (SRC) at ICCAD 2022, San Diego, CA, USA
- Nov 2022 "Efficient and Resilient Computing for Autonomous Systems"

  At ACM Student Research Competition (SRC) at ESWEEK 2022, virtual
- Oct 2022 "Efficient Algorithm-Hardware Co-Design for Robotic Mapping and Localization" At 5<sup>th</sup> IBM AI Compute Symposium, IBM T.J. Watson Research Center, Yorktown Heights, NY, USA
- Oct 2022 "Efficient Algorithm-Hardware Co-Design for Robotic Mapping and Localization"

  At CBRIC (Center for Brain-Inspired Computing) Annual Summit, Purdue University,

  West Lafayette, IN, USA
- Jun 2022 "Reliability of Autonomous Machines System Perspective" At COMPSAC Plenary Panel, Torino, Italy (virtual)
- Mar 2022 "FPGA-Based Robotic Computing: Current Progress, Challenges, and Opportunities" Guest Lecture in Georgia Tech ECE8893 (Parallel Programming for FPGAs), Atlanta, GA. USA
- Feb 2022 "FPGA-Based Robotic Computing: Current Progress, Challenges, and Opportunities"

At CRNCH (Center for Research into Novel Computing Hierarchies) Annual Summit, Atlanta, GA, USA

Nov 2021 "Efficient and Reliable Computing for Autonomous Machines" At ACM Student Research Competition (SRC) at ICCAD 2021, virtual

Oct 2021 "Enabling Reliable and Safe Autonomous Systems"

At CBRIC (Center for Brain-Inspired Computing) Annual Summit, Purdue University,

West Lafayette, IN, USA (virtual)

Aug 2021 "Analyzing and Improving Resilience of Autonomous Systems - From Hardware Faults Perspective"

At CBRIC (Center for Brain-Inspired Computing) Industry Talk, virtual

## **RELATED COURSES**

GT ECE8893 Parallel Programming for FPGAs

Instructor: Prof. Cong (Callie) Hao

GT ECE6115 Interconnection Networks for High-Performance Systems

Instructor: Prof. Tushar Krishna

Project: SCALE-Sim + Accelergy: Enabling Timing Predictability and Energy Estimation

of Systolic CNN-Accelerator

GT ECE6130 Advanced VLSI Systems

Instructor: Prof. Saibal Mukhopadhyay

GT ECE8803 Memory Device Technologies and Applications

Instructor: Prof. Shimeng Yu

GT CS7292 Reliable Computer Architecture

Instructor: Prof. Moinuddin Qureshi

Project: Low-Cost Error Detection and Correction for Compute In-Memory Systems

GT CS6476 Computer Vision

Instructor: Prof. James Hays

Harvard CS246 Advanced Computer Architecture

Instructor: Prof. David Brooks

Project: SoC-DNN Design Space Exploration and Optimization

Harvard CS247r Special Topics in Computer Architecture

Instructor: Prof. David Brooks

Project: Study of Posit Numeric in Speech Recognition Neural Inference

Harvard CS249r Edge Computing - Autonomous Machines

(Best Project Instructor: Prof. Vijay Janapa Reddi

Award) Project: AutoX: Automating Algorithm-SoC Co-Design for Aerial Robots

Harvard ES201 Decision Theory

Instructor: Prof. Demba Ba

Project: Web Traffic Time Series Forecasting

MIT 6.374 Analysis and Design of Digital Integrated Circuits

(Best Project Instructor: Prof. Vivienne Sze

Award) Project: Image Pre-processor for Robust DNN Resistant to Adversarial Attacks

MIT 6.888 Hardware Architecture for Deep Learning

Instructor: Prof. Vivienne Sze & Prof. Joel Emer

MIT 6.867 Machine Learning

Instructor: Prof. Devavrat Shah, Prof. Suvrit Sra, Prof. David Sontag Project: Generative Model for Human Pose Transferring Between Videos

# **MENTORSHIP**

Fall 2022 Maanas Purushothapu (BS - Georgia Tech), Nishant Sharma (BS - Georgia Tech)

Project: Accelerating Robotic Computing with FPGAs

Spring 2022 Zhenkun Fan (MS - Georgia Tech)

Project: Benchmarking Unsupervised Adaptation on Edge Devices

Spring 2022 Ying-Hao Wei (MS - Georgia Tech)

Project: Reliability Analysis and Improvement of Autonomous Intelligent Systems

Fall 2021 Katarine Emanuela Klitzke (Undergrad - Georgia Tech)

Project: Architectural Analysis and Benchmarking for UAV Navigation Systems

Summer 2020 Prateek Pinisetti (Undergrad - Harvard)

Project: Performance Modeling for Cyber-Physical Co-Design in UAV

### **ACADEMIC SERVICE**

ML Commons (MLPerf) Research Working Group

Co-found ML Commons Resilience and Robustness Research Working Group, 2022

**DAC** IEEE/ACM Design Automation Conference (DAC)

Technical Program Committee, 2023

**IEEE T-CAD** IEEE Transactions on Computer-Aided Design of Integrated Circuits and Systems

Reviewer, 2023

**IEEE TBioCAS** IEEE Transactions on Biomedical Circuits and Systems

Reviewer, 2023

**ISCA** IEEE/ACM International Symposium on Computer Architecture (ISCA)

Artifact Evaluation Committee, 2023

MICRO IEEE/ACM International Symposium on Microarchitecture (MICRO)

Artifact Evaluation Committee, 2022

ASPLOS IEEE/ACM International Conference on Architectural Support for Programming

Languages and Operating Systems (ASPLOS)

Artifact Evaluation Committee, 2023 Artifact Evaluation Committee, 2022

IISWC IEEE International Symposium on Workload Characterization (IISWC)

Artifact Evaluation Committee, 2022

Student Volunteer, 2019

NPC IFIP International Conference on Network and Parallel Computing (NPC)

Technical Program Committee, 2022

**COMPSAC** IEEE Computers, Software & Applications Conference (COMPSAC)

Panelist, 2022

**IEEE Entrep.** IEEE Entrepreneurship of China Region

Steering Committee, 2023

## **SKILLS**

**Programming** Python, C/C++, Verilog/SystemVerilog, MATLAB

ML Framework Pytorch, TensorFlow, Keras, Caffe

> Virtuoso, Design Compiler, Innovous, Calibre, Vivado, Quartus, OrCAD, MultiSim, Altium Designer, Unreal Engine, AirSim **Tool**