Abdulrahman Mahmoud

Curriculum Vitae - December 2023

CONTACT INFORMATION

EMAIL: mahmoud@seas.harvard.edu WEBSITE: https://ma3mool.github.io

RESEARCH INTERESTS

My research interests are at the intersection of computer architecture, software system design, and machine learning, with the goal of co-designing future ML systems for high performance, scalable reliability, and intelligent resource allocation.

Keywords: Systems for ML; ML for Systems; Reliability and Robustness

CURRENT EMPLOYMENT

FEB '21 - PRESENT | Harvard University

Postdoctoral Research Fellow, School of Engineering and Applied Science (SEAS)

Advisors: David Brooks and Gu Yeon-Wei

Jun '23 - Present | ControlRooms.ai

Consultant, ML Methodologies for Anamoly Detection

EDUCATION

Aug '13 - Dec '20 | University of Illinois at Urbana-Champaign (UIUC)

PhD in Computer Science

Advisor: Sarita Adve

Recipient of the Mavis Future Faculty Fellowship

Thesis Title: Towards Scalable and Specialized Application Error Analysis

SEP '09 - MAY '13 | Princeton University

BSE in Electrical Engineering

Certificate (minor): Applications of Computing Advisors: David Wentzlaff and Sharad Malik

Recipient of the **John Ogden Bigelow Jr**. **Prize** in Electrical Engineering Thesis Title: *Parallel Architecture Optimization for Threaded Applications*

RESEARCH AND WORK EXPERIENCES

DEC '20 - JUNE '21 | Splice Machine

Systems Engineer and Consultant, ML and Cloud Team

Supervisor: Ben Epstein

MAY '18 - SEPT '18 | **Nvidia Corporation**

Graduate Research Intern, Computer Architecture Research Group

Supervisor: Steve Keckler; Mentor: Siva Hari

May '17 - Aug '17 | Nvidia Corporation

Graduate Research Intern, Computer Architecture Research Group

Supervisor: Steve Keckler; Mentor: Siva Hari

JUNE '13 - AUG '13 | ST Engineering iDirect

Software Design Architect Intern, Embedded Devices Team

Supervisor: Assem Salama

JUNE '11 - SEPT '11 | Mid-InfraRed Technologies for Health and Environment (MIRTHE)

Research Experience for Undergraduates (REU), Princeton University

Advisor: Paul Prucnal

AWARDS AND DISTINCTIONS

- 2022 Meta Silent Data Corruptions at Scale RfP Grant Finalist
- 2021 Cultural Competence in Computing (3C) Fellow, Duke
- 2020 NextProf Nexus Future Faculty (1 of 59 invitations, USA), hosted by Berkeley, GTech, UMich
- 2019 Lynn Conway Research Award for Best Technical Demonstration at ADA, a JUMP center
- 2019 Mavis Future Faculty Fellowship for promising students pursuing academic careers, UIUC
- 2019 Heidelberg Laureate Forum Young Researcher (1 of 200 invitations worldwide)
- 2015 List of Teachers Ranked as Excellent by their Students (Campus Award), UIUC
- 2013 John Ogden Bigelow Jr. Prize in Electrical Engineering, Princeton
- 2013 Friedland Senior Thesis Fund for Senior Thesis Research, Princeton
- 2012 SEAS McCracken Senior Thesis Fund for Senior Thesis Research, Princeton
- 2012 Friedland Independent Work Fund for Junior Undergrad Research, Princeton
- 2011 Accenture SEAS Senior Thesis Fund for Junior Undergrad Research, Princeton

PUBLICATIONS

13 top-tier conference/journal papers, 8 workshop papers, 5 open-sourced research tools, 3 invited industry papers, and 1 awarded patent. Undergraduate U and graduate G students mentored by me labeled accordingly.

Peer-reviewed Conference Papers

c11. [NeurIPS 2023] Hardware Resilience Properties of Text-Guided Image Classifiers

Syed Talal Wasim U , Kabila Haile Soboka $^{\dot{U}}$, <u>Abdulrahman Mahmoud</u>, Salman Khan, David Brooks, Gu-Yeon Wei

In Conference on Neural Information Processing Systems (NeurIPS), 2023

Acceptance rate: 26%

* Novel training routine using GPT3 and CLIP to improve DNN accuracy and hardware reliability via textual-visual signaling.

c10. [MLSys 2023] ApproxCaliper: A Programmable Framework for Application-aware Neural Network Optimization

Yifan Zhao, Hashim Sharif, Peter Pao-Huang, Vatsin Shah, Arun Narenthiran Sivakumar, Mateus Valverde Gasparino, <u>Abdulrahman Mahmoud</u>, Nathan Zhao, Sarita Adve, Girish Chowdhary, Sasa Misailovic, Vikram Adve

In Sixth Conference on Machine Learning and Systems (MLSys), 2023

Acceptance rate: 22%

* Enabling cost-effective devices to meet essential ML System performance, prompting EarthSense, a top agri-robotics developer, to explore budget-friendly computing options.

c9. [DATE 2023] MAVFI: An End-to-End Fault Analysis Framework with Anomaly Detection and Recovery for Micro Aerial Vehicles

Yu-Shun Hsiao G , Zishen Wan G , Tianyu Jia, Radhika Gosal, <u>Abdulrahman Mahmoud</u>, Arijit Raychowdhury, David Brooks, Gu-Yeon Wei, and Vijay Janapa Reddi

In Design Automation and Test in Europe Conference (DATE), 2023

Acceptance rate: 25.0%

Open-source tool: https://github.com/harvard-edge/MAVBench/tree/mavfi

* First resiliency- and safety-oriented framework for micro-aerial vehicles operating on Robot Operating System (ROS)-based applications.

c8. [DSN 2022] GoldenEye: A Platform for Evaluating Emerging Numerical Data Formats in DNN Accelerators

<u>Abdulrahman Mahmoud</u>, Thierry Tambe^G, Tarek Aloui^U, David Brooks, and Gu-Yeon Wei In *The International Conference on Dependable Systems and Networks (DSN)*, 2022

Acceptance rate: 18.7%

Open-source tool: https://vlsiarch.eecs.harvard.edu/software/goldeneye

Featured in the 2022 ICCAD CADathlon as the System Design & Analysis challenge problem!

* An efficient, software-directed, DSE platform which navigates numerical precision, hardware performance, area, and DNN accuracy for accelerator design.

c7. [DATE 2022] FRL-FI: Transient Fault Analysis for Federated Reinforcement Learning-Based Navigation Systems

Zishen Wan^G, Aqeel Anwar, <u>Abdulrahman Mahmoud</u>, Tianyu Jia, Yu-Shun Hsiao, Vijay Janapa Reddi, and Arijit Raychowdhury

In Design Automation and Test in Europe Conference (DATE), 2022

Acceptance rate: 24.0%

- * Enables ultra-low cost, system-level detection and recovery mechanisms for swarm-based federated learning environments
- c6. [ISSRE 2021] Optimizing Selective Protection for CNN Resilience

Abdulrahman Mahmoud, Siva Kumar Sastri Hari, Christopher W. Fletcher, Sarita V. Adve, Charbel Sakr, Naresh Shanbhag, Pavlo Molchanov, Michael B. Sullivan, Timothy Tsai, and Stephen W. Keckler In *The International Symposium on Software Reliability Engineering (ISSRE), 2021*Acceptance rate: 27.5%

* Presents a novel domain-specific metric for quickly and accurately measuring DNN vulnerability to hardware errors.

c5. [DSN 2019] gem5-Approxilyzer: an Open Source Tool for Application-Level Soft Error Analysis
Radha Venkatagiri, Khalique Ahmed^G, Abdulrahman Mahmoud, Sasa Misailovic, Darko Marinov,
Christopher W. Fletcher, and Sarita V. Adve

In The International Conference on Dependable Systems and Networks (DSN), 2019 Acceptance rate: 21.4%

Open-source tool: https://github.com/rsimgroup/gem5-approxilyzer

* An automated, comprehensive, and ISA-centric framework for software-directed reliability and approximations.

c4. [ASPLOS 2019] Minotaur: Adapting Software Testing Techniques for Hardware Errors

<u>Abdulrahman Mahmoud</u>, Radha Venkatagiri, Khalique Ahmed^G, Sasa Misailovic, Darko Marinov,
Christopher W. Fletcher, and Sarita V. Adve

In The International Conference on Architecture Support for Programming Languages and Operating Systems (ASPLOS), 2019

Acceptance rate: 21.1%

Featured in UMichigan EECS481: Software Engineering reading list, Winter 2020!

* Lays the foundation for a software engineering discipline for hardware errors, leading to principled and scalable software resiliency analyses and hardening for hardware errors.

c3. [SC 2018] Optimizing Software-Directed Instruction Replication for GPU Error Detection

<u>Abdulrahman Mahmoud</u>, Siva Kumar Sastry Hari, Michael B. Sullivan, Timothy Tsai, and Stephen
W. Keckler

In The International Conference for High Performance Computing, Networking, Storage, and Analysis (SC), 2018

Acceptance rate: 19.1%

* The first GPU-specific hardware-software co-designed reliability techniques, and a granted patent for its discovery.

c2. [MICRO 2016] Approxilyzer: Towards a Systematic Framework for Instruction-Level Approximate Computing and its Application to Hardware Resiliency

Radha Venkatagiri, <u>Abdulrahman Mahmoud</u>, Siva Kumar Sastry Hari, and Sarita V. Adve In *The 49th Annual IEEE/ACM International Symposium on Microarchitecture (MICRO), 2016* Acceptance rate: 21.6%

Open-source tool: https://ma3mool.github.io/Approxilyzer/

* Novel approximate computing framework which navigates the space between hardware reliability overhead and end-toend application quality.

c1. [ICNP 2012] Verification and Synthesis of Firewalls Using SAT and QBF

Shuyuan Zhang, <u>Abdulrahman Mahmoud</u>, Sharad Malik, and Sanjai Narain In The 20th IEEE International Conference on Network Protocols (ICNP), 2012

Acceptance rate: 22.9%

* A SAT-based technique for equivalence and inclusion checking in network firewalls.

Peer-reviewed Journal Papers

j2. [TCAD 2023] Silent Data Corruption in Robot Operating System: A Case for End-to-End System-Level Fault Analysis Using Autonomous UAVs

Yu-Shun Hsiao G , Zishen Wan G , Tianyu Jia, Radhika Gosal, <u>Abdulrahman Mahmoud</u>, Arijit Raychowdhury, David Brooks, Gu-Yeon Wei, and Vijay Janapa Reddi

In IEEE Transactions on Computer-Aided Design of Integrated Circuits and Systems (TCAD), 2023

j1. [TACO 2020] Inter-Kernel Reuse-Aware Thread Block Scheduling

Muhammad Huzaifa, Johnathan Alsop, <u>Abdulrahman Mahmoud</u>, Giordano Salvador, Matthew D. Sinclair, and Sarita V. Adve

In ACM Transactions on Architecture and Code Optimization (TACO), 2020

Peer-reviewed Workshop Papers

w8. [YARCH 2022] A Dataflow-Aware Fault Resilience Analysis Framework for Deep Neural Network Accelerators

Jaylen Wang^U, <u>Abdulrahman Mahmoud</u>, David Brooks, and Gu-Yeon Wei In *The Fourth Young Architect Workshop (YArch)*, co-located with ASPLOS, 2022

w7. [WCAE 2021] Mentoring Opportunities in Computer Architecture: Analyzing the Past to Develop the Future

Elba Garza, Gururaj Saileshwar, Udit Gupta, Tianyi Liu, <u>Abdulrahman Mahmoud</u>, Saugata Ghose, and Joel Emer

In Workshop on Computer Architecture Education (WCAE), co-located with ISCA, 2021

w6. [DSN-DSML 2020] PyTorchFI: A Runtime Perturbation Tool for DNNs

 $\underline{\textbf{Abdulrahman Mahmoud}}$, Neeraj Aggarwal U , Alex Nobbe U , Jose Rodrigo Sanchez Vicarte, Sarita V. Adve, Christopher W. Fletcher, Iuri Frosio, and Siva Kumar Sastry Hari

In Dependable and Secure Machine Learning (DSML), co-located with DSN, 2020

Open-source tool: https://github.com/pytorchfi

Downloaded more than 47,000×!

Accepted into the PyTorch EcoSystem!

Adopted by Intel Labs!

Received Lynn Conway Award for Best Technical Demo at the ADA Research Center!

w5. [SARA 2020] Feature Map Vulnerability Evaluation in CNNs

Abdulrahman Mahmoud, Siva Kumar Sastry Hari, Christopher W. Fletcher, Sarita V. Adve, Charbel Sakr, Naresh Shanbhag, Pavlo Molchanov, Michael B. Sullivan, Timothy Tsai, and Stephen W. Keckler In Workshop on Secure and Resilient Autonomy (SARA), co-located with MLSys, 2020 Extended version on arXiv: https://arxiv.org/abs/2002.09786

w4. [WAX 2019] Approximate Checkers

<u>Abdulrahman Mahmoud</u>, Paul Reckamp U , Panqiu Tang U , Christopher W. Fletcher, and Sarita V. Adve In *Workshop on Approximate Computing Across the Stack (WAX)*, co-located with PLDI, 2019

w3. [WACI 2019] VR Swarms: Enabling Shared Virtual Experiences

Muhammad Huzaifa and Abdulrahman Mahmoud

In Workshop on Wild and Crazy Ideas (WACI), co-located with ASPLOS, 2019

w2. [WAX 2017] Leveraging Software Testing to Explore Input Dependence for Approximate Computing Abdulrahman Mahmoud, Radha Venkatagiri, Khalique Ahmed^G, Sarita V. Adve, Darko Marinov, and Sasa Misailovic

In Workshop on Approximate Computing Across the Stack (WAX), co-located with ASPLOS, 2017

w1. [WAX 2016] Towards More Precision in Approximate Computing

Radha Venkatagiri, Abdulrahman Mahmoud, and Sarita V. Adve

In Workshop on Approximate Computing Across the Stack (WAX), co-located with ASPLOS, 2016

Invited Industry Papers

- i3. [TECHCON 2020] HarDNN: Fine-Grained Vulnerability Evaluation and Protection for CNNs <u>Abdulrahman Mahmoud</u>, Siva Kumar Sastry Hari, Christopher W. Fletcher, Sarita V. Adve, Charbel Sakr, Naresh Shanbhag, Pavlo Molchanov, Michael B. Sullivan, Timothy Tsai, and Stephen W. Keckler In Semiconductor Research Corporation Workshop (SRC TECHCON), 2020
- i2. [TECHCON 2019] Towards General-Purpose, Comprehensive, and Automated Soft Error Analysis Radha Venkatagiri, Khalique Ahmed G , <u>Abdulrahman Mahmoud</u>, Sasa Misailovic, Darko Marinov, Christopher W. Fletcher, and Sarita V. Adve

In Semiconductor Research Corporation Workshop (SRC TECHCON), 2019

ii. [TECHCON 2018] Harnessing Software Testing Techniques for Hardware Resiliency Analysis

Abdulrahman Mahmoud, Radha Venkatagiri, Khalique Ahmed^G, Sasa Misailovic, Darko Marinov,
Christopher W. Fletcher, and Sarita V. Adve

In Semiconductor Research Corporation Workshop (SRC TECHCON), 2018

Patents

p1. **Optimizing Software-Directed Instruction Replication for GPU Error Detection**Siva Kumar Sastry Hari, Michael B. Sullivan, Timothy Tsai, Stephen W. Keckler, and **Abdulrahman Mahmoud** *US2019/0102180A1. Filed Oct. 3, 2018. Granted Oct. 27, 2020.*

GRANTS AND GIFTS

• [Salata Institute Seed Grant - Harvard University] Carbon Facts: Counting and Reporting Carbon for Computers and Electronics. 2023.

PIs: Gu-Yeon Wei (Primary), David Brooks, and Abdulrahman Mahmoud

Funded amount: \$30,000.

Wrote major sections of grant proposal.

• [Meta Research] An Automated Framework for Principled, Selective Reliability on Underutilized Hardware. 2022.

PIs: David Brooks (Primary), Gu-Yeon Wei, and Abdulrahman Mahmoud Selected as a finalist from 65 proposals.

Wrote full grant proposal with feedback from advisors, building upon [c3, c6, w6] as prior work.

• [NSF Medium] Software Engineering for Hardware Errors. 2020.

PIs: Sarita Adve (Primary), Darko Marinov, Sasa Misailovic, and Christopher Fletcher Funded amount: \$1,200,000.

Assisted in writing portions of the grant, building upon [c5, c4, c2] as prior work.

• [Nvidia Research] 2× Titan Xp GPU gift. 2018.

Non-Refereed Tech Articles

I have published 7 feature articles on TechSpot.com, a tech enthusiast website. These articles discuss technical topics for a general audience. My articles have garnered over 126k views and 1.7k shares on social media platforms.

ts7. Explainer: Number Representations in Computer Hardware

https://www.techspot.com/article/2630-number-representation-in-hardware/ March 6, 2023

ts6. What is Sustainable Computing? A shift in how we develop the hardware of the future

https://www.techspot.com/article/2474-sustainable-computing/ Sep 6, 2022

ts5. Dual Booting: Windows and Ubuntu

https://www.techspot.com/article/2422-dual-boot-windows-ubuntu/ Mar 14, 2022

ts4. Explainer: What is a File System?

https://www.techspot.com/article/2377-file-system-explainer/ Dec 6, 2021

ts3. The State of Quantum Computing Systems: Current Designs and Future Challenges

https://www.techspot.com/article/2361-state-of-quantum-computing-systems/ Nov 15, 2021

ts2. What is Crypto Mining?

https://www.techspot.com/article/2246-what-is-cryptomining/ Aug 18, 2021

ts1. What is Quantum Computing?

https://www.techspot.com/article/2280-what-is-quantum-computing/ Jun 28, 2021

MENTORING AND TEACHING CERTIFICATION

FAS Undergraduate Science Mentoring Certificate, Harvard 2022

CITL Certificate in Foundations of Teaching, UIUC 2020

2019 URAP Mentoring Certificate for Undergraduate Student Research Mentorship, UIUC

TEACHING EXPERIENCE

SEPT '23 - DEC '23 CS247r: Advanced Topics in Computer Architecture, Harvard University

Co-Instructor, co-taught with David Brooks

ISCA-50 Anthology Seminar: Co-led seminar series to discuss the ISCA@50 25-Year Retrospective: 1996-2020 (https://sites.coecis.cornell.edu/isca50retrospective/papers/).

JAN '23 - MAY '23 | CS246: Advanced Computer Architecture, Harvard University

Teaching assistant; Instructor: David Brooks

Assisted students choose and pursue a course project on computer architecture. Led a weekly "Fireside Chat" series with industry folks working in computer architecture.

SEPT '22 - DEC '22

CS247r: Advanced Topics in Computer Architecture, Harvard University

Co-Instructor, co-taught with David Brooks

Designed a new programming assignment based off of [c2]. Taught lecture on "Reliability + Architecture". Syllabus design, weekly office hours, and maintain course website.

SEPT '19 - DEC '19

CS433: Computer System Organization, UIUC

Teaching Assistant; Instructor: Sarita Adve

Held weekly office hours, prepared HWs and Exams, updated course website, and answered student questions on Piazza. Taught one lecture on memory consistency and coherence.

JAN '19 - MAY '19

KGSP: Introduction to Computer Science, UIUC

Co-Instructor, co-taught with Maxim Belkin

https://kgsp.kaust.edu.sa/

Updated course syllabus and material, taught 50% of lectures, and administered assignments and exams.

JAN '18 - MAY '18

KGSP: Introduction to Computer Science, UIUC

Co-Instructor, co-taught with Nahil Sobh

https://kgsp.kaust.edu.sa/

Designed course from scratch, taught 90% of lectures, and administered assignments and exams.

SEPT '15 - DEC '15

CS233: Computer Architecture, UIUC

Teaching Assistant; Instructors: Sarita Adve and Craig Zilles

Taught discussion sessions, helped write and administer quizzes and exams. Taught a few lectures with a class size of 200+ students.

JAN '13 - MAY '13

ELE302: System Design and Analysis, Princeton University

Lab Teaching Assistant; Instructors: Andrew Houck and Antoine Kahn

Assist upperclassmen in ELE core lab: designing an automated car with speed control and lane-maintaining algorithms. Help in electronic circuitry, algorithmic design, and sensor- μ controller interface.

SEPT '12 - DEC '12

ELE206: Introduction to Logic Design, Princeton University

Lab Teaching Assistant; Instructor: Sharad Malik

Assist underclassmen in digital logic design, specifically Verilog programming and learning design concepts.

SEPT '11 - MAY '13

General Undergraduate CS Lab TA, Princeton University

Lab Teaching Assistant

Assist students and help debug their programs in intro computer science courses, including Intro to CS, Algorithms and Data Structures, and Intro to Programming Systems. Languages include Java and C.

GRADUATE AND UNDERGRADUATE RESEARCH MENTORING

Mentored and co-advised 19 students, including two senior undergraduate theses at Harvard University.

- 19. Celine Lee (Graduate student, Cornell Tech)
- 18. Amrit Baveja (BS '26, Stanford)
- 17. Ali Khan (BS '26, Harvard)
- Syed Talal Wasim (Fatima Fellowship mentee, '22 cohort)
 Co-authored [c11].
- 15. Kabila Haile Soboka (Fatima Fellowship mentee, '22 cohort) Co-authored [c11].
- 14. Sneha Khandelwal (Fatima Fellowship mentee, '22 cohort) ⇒ Data Scientist at Genpact
- 13. Muhammad Sajid Ahmed (Fatima Fellowship mentee, '22 cohort) ⇒ ML Engineer at AlterSense
- 12. Hasnain Naeem (Fatima Fellowship mentee, '22 cohort) ⇒ Software Engineer at Motive
- 11. Joshua Park (BS '25, Harvard)
 Selected for Harvard SPUDS 2023 program (https://datascience.harvard.edu/programs/spuds/).

- 10. Tarek Aloui (BS '24, Harvard)
 - Selected as a Harvard PRISE Fellow 2022 (https://uraf.harvard.edu/uraf-opportunities/prise). Co-authored [c8].
- 9. William Meng (BS '22, Harvard) ⇒ UPenn Graduate School Senior Thesis Advisor.
- 8. Jaylen Wang (BS '22, Harvard) \Rightarrow CMU Graduate School Senior Thesis Advisor.

2022 Dean's Award for Outstanding Senior Thesis (awarded to 4 Harvard undergrads per year). 2023 NSF Graduate Research Fellowship Program (GRFP) Award Winner. Co-authored [w8].

- 7. Rahul Singh (Graduate Student, UIUC)
- 6. Alex Nobbe (BS '22, UIUC) \Rightarrow Boeing Co-authored [w6].
- 5. Neeraj Aggarwal (BS '21, UIUC) ⇒ CMU Graduate School Co-authored [w6].
- 4. Paul Reckamp (BS '20, UIUC) \Rightarrow UIUC Graduate School Co-authored [w4].
- 3. Panqui (Phoebe) Tang (BS '20, UIUC) ⇒ UCLA Graduate School Co-authored [w4].
- 2. Aditi Ghosalkar (BS '21, UIUC)
- Khalique Ahmed (MS '18, UIUC) ⇒ AMD Research Co-authored [c4, c5, w2].

PROFESSIONAL SERVICES AND ACTIVITIES

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Reviewing:	
2024	YArch Program Committee (PC)
2024	ISQED Program Committee (PC)
2023	MICRO SRC Program Committee (PC)
2023	ML and Systems Rising Stars (PC Co-Chair)
2023	ICCD Program Committee (PC)
2023	MICRO Program Committee (PC)
2023	YArch Program Committee (PC)
2022	ASPLOS Extended Review Committee (ERC)
2022	YArch Program Committee (PC)
2022	Transactions of Computing Reviewer
2021	MICRO Artifact Evaluator (AE)
Leadership and Service:	
2023-Present	Organizing Committee for Fatima Fellowship
2022-Present	Co-chair of Computer Architecture Long-term Mentoring (CALM)
2020-Present	Founding Member of Computer Architecture Student Association (CASA)
2021, 2022	Steering Committee for CALM
2021, 2022	Social Co-Chair at ASPLOS 2021 and ASPLOS 2022
2013-2022	Princeton Alumni Schools Committee (ASC) - Interviewer
2013-2020	UIUC Graduate Student Ambassador for recruiting
Workshop Organization:	
2023-Present	ML and Systems Rising Stars, in collaboration with ML Commons
2021, 2022, 2023, 2024	Undergrad Architecture Mentoring Workshop (uArch), co-located with ISCA
2022	JOBS Workshop, co-located with MICRO
2022	Mental Health Workshop for CASA, in collaboration with Rice University
2021	Mental Health Workshop for CASA, in collaboration with PhD Balance
Student Mentoring Activities:	
MAY 2020	Judge for UIUC Undergraduate Research Symposium
FEBRUARY 2020	HackIllinois Mentor. Theme: Open-Source Contribution
FALL 2018 - SPRING 2019	URAP Mentor: Undergraduate Research Apprenticeship Program
FALL 2018 - SPRING 2019	PURE Mentor: Promoting Undergraduate Research in Engineering
SPRING 2019	MUSE Mentor: Mentoring Undergraduates in Science and Engineering