Keshav Bimbraw

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EDUCATION

Worcester Polytechnic Institute Worcester, MA

Ph. D. Candidate in Robotics Engineering (Medical FUSION Lab)

Aug '20 – Dec '24 (tentative) Concentration - Ultrasound Image Processing, Medical Robotics & Human-Machine Interfacing 4.00/4.00 GPA

Georgia Institute of Technology

M. S. with Robotics Focus (Music Technology, Computer Software & Media Applications) Aug '17 - May '19 3.56/4.00 GPA

Concentration - Human Augmentation, Medical Robotics & Robotic Musicianship

Thapar University Patiala, India July '13 - June '17 B. E. in Mechatronics Engineering (Research Intern - IIT Delhi, Jan – Jul '16)

Concentration - Robotics & Mechatronics

EXPERIENCE

OnPoint Surgical Concord, MA

Software Engineer, Machine Learning

• Working as a machine learning software engineer in the surgical robotics space.

Mitsubishi Electric Research Laboratories

Cambridge, MA

Oct '24 - now

4.00/4.00 GPA (8.34 CGPA)

Atlanta, GA

Research Intern (Connectivity and Information Processing Group, Mentor: Toshiaki Koike-Akino)

June '24 - Aug '24

- · Worked on exciting research directions focusing on using Generative AI and Vision Language Models (VLMs) such as GPT-40 as intelligent agents for signal processing and predictive analysis. Paper accepted to NeurIPS 2024 AIM-FM workshop.
- · Analyzed ultrasound image classification performance of large vision language models and improved it using retrieval augmented generation (RAG) and few-shot in context learning (ICL). Developed a demonstration for LVLM driven robot control.

Worcester Polytechnic Institute (WPI)

Worcester, MA

PhD Candidate (Medical FUSION Lab, Adviser: Haichong K. Zhang)

March '20 - Oct '24

- Funded by Amazon Robotics GBTI for the 2023-2024 academic year to use ultrasound to estimate finger forces to improve a haptic feedback system. Demonstrated ultrasound based continuous force estimation with an error of 5% (IEEE IUS '23). Paper. Video.
- Developed a pipeline for simultaneously estimating finger forces and hand gestures from a single ultrasound image using a two-stage Convolution Neural Network (CNN) based pipeline (NEMS '24).
- · Worked on using incremental learning, 3D CNN based video classification and fine tuning approaches to improve ultrasound based gesture recognition towards inter-session generalizability (2 papers accepted to IEEE IUS '24).
- Developed an innovative mirror-based ultrasound system for gesture classification, utilizing CNNs and Vision Transformers (ViT), and achieving a gesture classification accuracy of 93% (SPIE Medical Imaging '24). Paper.
- Developed a data-driven hand gesture recognition pipeline for VR interfacing (Meta Quest Pro) using ultrasound data and CNNs, achieving online accuracy of 92% for 4 gestures, and a low pipeline latency of 59.48 ms. Paper. Video.
- Developed a deep learning based pipeline to predict finger angles & hand configurations from forearm ultrasound images. Achieved an error of 7.35° for finger joint angle prediction (IEEE ICRA '22). Paper. Video. Extended version published in IEEE T-MRB.
- Conceptualized a novel augmented reality based lung ultrasound scanning guidance system (MICCAI ASMUS '20). Paper. Video.
- Established the real-time ultrasound data acquisition software framework for a tele-operative low-cost lung ultrasound robot. Paper.
- Designing an ultrasound based American Sign Language classification system using machine learning. Poster presented at ICRA '22.
- Mentoring and assisting undergraduate teams with their major qualifying projects and independent research studies.

Mitsubishi Electric Research Laboratories

Cambridge, MA

Designed pipelines for multi-modal biosignal data acquisition and human-machine interaction in AR/VR/XR applications.

May '23 – Aug '23

- Incorporated adversarial regularization to bolster hand gesture classification performance in the context of domain adaptation.
- Leveraged random channel ablation to optimize the performance across multiple biosignal modalities for hand gesture classification.
- Demonstrated that we can make multi-modal biosignal based gesture classification robust to missing channel data (IEEE EMBC '24).

Nokia Bell Labs New Providence, NJ

Augmented Human Sensing Intern/Co-Op (Data & Devices Group, Mentor: Mingde Zheng)

Research Intern (Connectivity and Information Processing Group, Mentor: Toshiaki Koike-Akino)

June '22 - Dec '22

- Designed low-latency biosignal based pipelines (sEMG, IMU) to estimate bodily motion for Human-Machine Interaction. Video.
- Submitted and presented a paper (IEEE SII 2023) and multiple invention reports. Offered a Co-Op extension, which was accepted.
- Developed demonstrations for biosignal-based remote multi-sensor real-time shared-autonomy industrial robotic applications.

- Investigated multi-channel sEMG based hand movement classification for robotic control using deep learning (MLP, CNN).
- Utilized transfer learning approach for improving performance of sEMG based hand configuration classification from 91% to 96%.

Agile Resources Inc.

Peachtree City, GA

Audio DSP Engineer (Panasonic Automotive Systems of America)

Oct '19 - March '20

- · Developed Qualcomm's Hexagon SDK for audio applications in Eclipse on Android framework development.
- Utilized Qualcomm tools to evaluate audio modules such as Bass Mid Treble, Parametric Equalizer, Fade & Balance, etc.

Active Noise Control Engineering Intern (Automotive Systems Division)

Stow, MA May '19 – Oct '19

- Designed sound synthesis framework for electric vehicles and implemented processor-optimized signal processing algorithms.
- Devised a physical car sound simulation system using Logitech pedals to evaluate models and reduce testing time.

Georgia Institute of Technology (Georgia Tech) Research Assistant (Robotic Musicianship Lab)

Atlanta, GA

Aug '17 – May '19

- Lead the ML based ultrasound gesture classification project from Aug '18 May '19. Robot and code featured in The Age of A.I.
- Utilized ultrasound data from the forearm to classify hand grasping configurations for controlling a soft robotic gripper. Paper Link.
- Investigated a combination of Ultrasound & EMG data using supervised learning algorithms to enhance assistive robot control.
- Translated Piano playing to robots using a single DOF system and designed a robotic hand with one DOF per finger. Link.
- Created an ultrasound in the loop tendon-based wearable exoskeleton for upper extremity rehabilitation of stroke survivors. Link.
- Taught Computer-Aided Design (CAD), Fusion 360, 3D printing, and Mechatronics for Project Studio Course. Link, Link.

IIT Delhi Research Intern (Autonomous Robotics Lab)

New Delhi, India

Jan '16 – Aug '16

- Conceptualized and programmed the system framework for two KUKA KR-5 robotic arms to collaboratively play a guitar. Link.
- Improved performance of a 6 DOF motion platform at Simulator Development Division, Secunderabad, India. Link.
- Developed a teach pendant and a control module to control virtual robots in RoboAnalyzer software. Link.
- Modified the mechanical and electrical design of Tulsi Bead making device under the rural development initiative of IIT Delhi.

Research Interests

Bose Corporation

Human-Machine Interaction: Human-machine interfaces & robotics applications; AI-enabled robotics & medical image processing; Gesture & pose classification, estimation, & detection;

Machine Learning: Deep learning; Multi-modal data processing; Transfer Learning; Generative AI; Deep learning model optimization; Model compression; Data compression; Online learning; End-to-end deep learning pipelines;

Robotics: Wearable robotics & wearable sensor systems; Design & development of robots for human-robot interaction; Computer vision; Industrial robotics & automation; Robot teleoperation;

Medical Robotics: New technologies & methodologies in medical robotics; Ultrasound image processing; IoT (Internet of Things); Device development; Surgical robotics;

SKILLS

Software Skills

Python, TensorFlow, PyTorch, ROS, Linux, NumPy, MATLAB, OpenCV, C++

Deep Learning Model Experience

1D, 2D and 3D CNN, Vision Transformer, GPT-x, Enc-Dec, ResNet, MLP

Electrical/Electronic skills

3D Design/3D printing

SolidWorks, Autodesk Inventor, Autodesk Fusion 360, Unity, TinkerCAD, Cura Arduino, Raspberry Pi, Motors, Actuators, Hardware & software interfacing

Programming Frameworks

Shell Scripting, Git, Visual Studio Code, PyCharm, Version Control

ACADEMIC PROJECTS

Ultrasound based Gesture Recognition on Edge (WPI, On Device Deep Learning)

Fall '23

- Developed an edge solution for ultrasound based gesture classification by deploying a pre-trained CNN on a Raspberry Pi.
- Utilized Float16 quantization to reduce latency by 10 ms while achieving the same train and test accuracy.

Analyzing the performance of a cart pole system for different parameters for RL (WPI, Artificial Intelligence) Spring '23

- Implemented a Reinforcement Learning framework in PyTorch using OpenAI Gym where the goal is to keep a pole upright,
- Analyzed the performance of the system for Deep Q-Networks (DQN) and Q-Learning scenarios for various system parameters.

Comparing low & high-dimensional forearm ultrasound-based hand state classification (WPI, Machine Learning) Spring '22

- Investigated the feasibility of using image compression techniques for extracting the latent structure of ultrasound images. Link.
- Designed a real-time ML pipeline for training and testing models for hand motion classification based on forearm ultrasound.

Navigation of a Raspberry-Pi-based Robot using camera and Lidar data (Georgia Tech, Intro. To Robotics Research) Fall '18

- Used camera data to find the center of a ball and tracked it using Dynamixel actuators attached to a mobile robot.
- Used Lidar data to avoid obstacles and maintaining a specific distance from them while <u>moving towards a goal</u> (waypoint classification using SVM).

Design of an ultrasound-guided vein cannulation robot (Georgia Tech, Medical Robotics)

Spring '18

- Oversaw a 5-person multi-discipline team to develop a medical robot that can hold an ultrasound probe to detect jugular vein. Link.
- Designed and programmed a PRRRP configuration robot for its end effector to reach specific positions in the robot workspace.

LEADERSHIP

Leadership Experience at WPI

Fall '20 - now

- Mentored high school and undergraduate students towards ongoing research projects through Massachusetts Life Sciences Center (MLSC) High School Apprenticeship Program, Major Qualifying Projects (MQP), & Research Experience for Undergrads (REU).
- Senator and representative of the Robotics Department for the Graduate Student Government for academic year '21- '22.
- Member of the Rho Beta Epsilon Robotics Engineering society. Co-hosted a C++ workshop for beginners.
- Graduate Student Officer at The Alliance: the social, educational, & professional support network of LGBT+ students.

Vertically Integrated Projects (VIP) Instructor at Robotic Musicianship Lab at Georgia Tech

Fall '17 - Spring '19

· Lead teams of undergraduates in robotics and mechatronics research. Assisted with continual mentorship and guidance.

HONORS & AWARDS

• Won PhD Backlin Scholarship to cover tuition and health insurance through WPI.	Sept. '24	
Won IEEE EMBC NextGen Scholar Award.	May '24	
• Funded through Amazon Robotics GBTI Award for the 2023-2024 academic year (Tuition support & yearly award)	August '23	
• Selected for the 2021B cohort of Google Research's CSRMP. The first person at WPI to have ever been selected.	Sept. '21	
• Awarded PhD positions at WPI & Georgia Tech. Accepted the WPI offer. (Tuition support & \$31824 yearly award).	March '20	
• Selected to be Diversity and Inclusion Fellow by Georgia Tech Institute Diversity (\$1000 award).		
• Selected as NSF-NRT ARMS (Accessibility, Rehabilitation, & Movement Science) Trainee (\$1500 award).		
 Scholarship to pursue master's at Georgia Tech (Tuition support & \$14100 yearly award). 	August '17	
 Awarded merit scholarships and grants totaling INR 336,000 at Thapar University. 	June '17	

JOURNAL PUBLICATIONS

Published

- [1] **Bimbraw, K.**, Nycz, C. J., Schueler, M., Zhang, Z., & Zhang, H. K. (2023). Simultaneous estimation of hand configurations and finger joint angles using forearm ultrasound. *IEEE Transactions on Medical Robotics and Bionics*, *5*(1), 120-132. Paper.
- [2] Tsumura, R., Hardin, J.W., **Bimbraw, K.**, Grossestreuer, A.V., Odusanya, O.S., Zheng, Y., Hill, J.C., Hoffmann, B., Soboyejo, W. and Zhang, H.K., 2021. Tele-Operative Low-Cost Robotic Lung Ultrasound Scanning Platform for Triage of COVID-19 Patients. *IEEE Robotics and Automation Letters*, 6(3), pp.4664-4671. <u>Paper</u>. <u>Video</u>.

Awaiting Review

- [1] **Bimbraw, K.**, Wang, Y., Liu, J., & Koike-Akino, T. (2024, October). GPT Sonograpy: Hand Gesture Decoding from Forearm Ultrasound Images via VLM. *IEEE Journal of Biomedical and Health Informatics*. Paper.
- [2] **Bimbraw, K.**, Tang, Y., & Zhang, H. K. (2024, September). Acoustic Reflector based Forearm Ultrasound for Hand Gesture Classification. *IEEE Transactions on Medical Robotics and Bionics*.

In Preparation

- [1] **Bimbraw, K.**, Nekkanti, S., Tiller, D., Deshmukh, M., Calli, B., Howe, R. D., & Zhang, H. K. (2024, December). Simultaneous Estimation of Manipulation Skill and Hand Grasp Force from Forearm Ultrasound Images. *Cyborg and Bionic Systems, a Science journal*.
- [2] Lin F., **Bimbraw, K.**, Hou, S., Gao, S., Zhang, Z., and Zhang, H. K. (2024, December). Ultrasound-Based Hand Gesture Recognition with Cross-User Reproducibility through Deep Metric Learning with Triplet Network. *IEEE Robotics and Automation Letters*.

CONFERENCE PUBLICATIONS

[1] **Bimbraw, K.**, Zhang, H. K., & Islam, B. (2024, September). Forearm Ultrasound based Gesture Recognition on Edge. In *2024 IEEE Body Sensor Networks Conference*. Paper.

- [2] **Bimbraw, K.**, Talele, A., & Zhang, H. K. (2024, September). Hand Gesture Classification based on Forearm Ultrasound Video Snippets Using 3D Convolutional Neural Networks. In 2024 IEEE International Ultrasonics Symposium (IUS) (pp. 1-4). IEEE. Paper.
- [3] **Bimbraw, K.**, Rothenberg, J., & Zhang, H. K. (2024, September). Improving Intersession Reproducibility for Forearm Ultrasound based Hand Gesture Classification through an Incremental Learning Approach. In 2024 IEEE International Ultrasonics Symposium (IUS) (pp. 1-4). IEEE. Paper.
- [4] **Bimbraw, K.**, Liu, J., Wang, Y., & Koike-Akino, T. (2024, July). Random Channel Ablation for Robust Hand Gesture Classification with Multimodal Biosignals. In *2024 IEEE Engineering in Medicine and Biology Conference (EMBC)* (pp. 1-6). IEEE. <u>Paper</u>.
- [5] **Bimbraw**, K., & Zhang, H. K. (2024, April). Mirror-based Ultrasound System for Exploring Hand Gesture Classification through Convolutional Neural Network and Vision Transformer. In *Medical Imaging 2024: Ultrasonic Imaging and Tomography* (Vol. 12932, pp. 218-222). SPIE. Paper and Video.
- [6] **Bimbraw**, **K.**, Rothenberg, J., & Zhang, H. K. (2023, October). Leveraging Ultrasound Sensing for Virtual Object Manipulation in Immersive Environments. In 2023 IEEE 19th International Conference on Body Sensor Networks (BSN) (pp. 1-4). IEEE. Paper. Video.
- [7] **Bimbraw, K.**, & Zhang, H. K. (2023, September). Estimating Force Exerted by the Fingers Based on Forearm Ultrasound. In 2023 *IEEE International Ultrasonics Symposium (IUS)*. (pp. 1-4). <u>Paper</u>. <u>Video</u>.
- [8] **Bimbraw, K.**, & Zheng, M. (2023, January). Towards The Development of a Low-Latency, Biosignal-Controlled Human-Machine Interaction System. In 2023 IEEE/SICE International Symposium on System Integration (SII) (pp. 1-7). Paper. Video.
- [9] **Bimbraw, K.**, Nycz, C. J., Schueler, M. J., Zhang, Z., & Zhang, H. K. (2022, May). Prediction of Metacarpophalangeal joint angles and Classification of Hand configurations based on Ultrasound Imaging of the Forearm. In: *2022 International Conference on Robotics and Automation (ICRA)* (pp. 91-97). IEEE. Paper. Video.
- [10] **Bimbraw, K.**, Ma, X., Zhang, Z., Zhang, H. (2020). Augmented Reality-Based Lung Ultrasound Scanning Guidance. In: *Medical Ultrasound, and Preterm, Perinatal and Paediatric Image Analysis. ASMUS 2020, PIPPI 2020.* Lecture Notes in Computer Science, vol 12437. Springer, Cham. doi.org/10.1007/978-3-030-60334-2 11. Paper. Video.
- [11] **Bimbraw, K.**, Fox, E., Weinberg, G. and Hammond, F. L. (2020). Towards Sonomyography-Based Real-Time Control of Powered Prosthesis Grasp Synergies. In: 2020 42nd Annual International Conference of the IEEE Engineering in Medicine & Biology Society (EMBC), Montreal, QC, Canada, 2020, pp. 4753-4757, doi: 10.1109/EMBC44109.2020.9176483. Paper. Video.
- [12] Mehta, I., **Bimbraw, K.**, Chittawadigi, R. G., & Saha, S. K. (2016). A teach pendant to control virtual robots in Roboanalyzer. In: 2016 Int. Conference on Robotics and Automation for Humanitarian Applications (RAHA) (pp. 1-6). IEEE. Paper.
- [13] **Bimbraw, K.**, Mehta, I., Venkatesan, V., Joshi, U., Sabherwal, G. S., & Saha, S. K. (2016). Performance improvements of a 6-DOF motion platform. In: 2016 Int. Conference on Robotics & Automation for Humanitarian App. (RAHA) (pp. 1-5). IEEE. Paper.
- [14] Kaur, M., Singh, G., **Bimbraw**, K., & Uniyal, P. (2015). Study of phase transformation and microstructure of alcohol washed titania nanoparticles for thermal stability. In: *AIP Conference Proceedings* (Vol. 1675, No. 1, p. 030049). AIP Publishing. Paper.
- [15] **Bimbraw, K.** (2015). Autonomous cars: Past, present, and future. In: 2015 12th International Conference on Informatics in Control, Automation and Robotics (ICINCO) (Vol. 1, pp. 191-198). IEEE. Paper.

PRESENTATIONS AND POSTERS

- [1] **Bimbraw, K.**, Wang, Y., Liu, J., & Koike-Akino, T. (2024, July). GPT Sonograpy: Hand Gesture Decoding from Forearm Ultrasound Images via VLM. *AIM-FM: Advancements in Medical Foundation Models: Explainability, Robustness, Security, and Beyond at Neural Information Processing Systems (NeurIPS 2024).*
- [2] Murphy, A., **Bimbraw, K.**, Vostrikov, S., Enyedy, A., Cossettini, A., & Zhang, H. K. (2024). Towards Wearable Forearm Ultrasound Based Gesture Recognition for Human-Robot Interfacing. *Biomedical Engineering Society Meeting (BMES 2024)*.
- [3] **Bimbraw, K.**, Tang, Y., & Zhang, H. K. (2024). Acoustic Reflector based Forearm Ultrasound for Hand Gesture Classification. *Northeast Robotics Colloquium (NERC 2024)*.
- [4] **Bimbraw, K.**, & Zhang, H. K. (2024). Towards Forearm Ultrasound based Hand Gesture Classification and Finger Force Estimation using Deep Learning. *New England Manipulation Symposium (NEMS 2024)*.
- [5] Garza, J., **Bimbraw, K.**, Tang, Y., & Zhang, H. K. (2023). Integrating Vibrational Haptic Feedback on Sonomyography Hand Configuration Estimation. *2023 BMES Annual Conference*.
- [6] **Bimbraw, K.**, Rothenberg, J., & Zhang, H. K. (2022). Forearm Ultrasound Images can be Classified to Predict Static American Sign Language Letters. In: 2022 International Conference on Robotics and Automation Workshop on Human-centered Autonomy in Medical Robotics (IEEE ICRA). Poster. Abstract.
- [7] **Bimbraw**, K., Fox, E., Weinberg, G. & Hammond, F. L. (2019). Sonomyography based real-time hand grasp configuration identification via supervised learning to control a soft robotic gripper. In: 2019 Spring School on Medical Robotics (SSMR) and 2019 International Symposium on Medical Robotics (ISMR), Atlanta, GA, USA. Poster.
- [8] **Bimbraw, K.** (2018). Imparting expressivity and dynamics to percussive musical robot Shimon. In: Three Minute Thesis (3MTTM) at Georgia Tech. Link.
- [9] Rosa, L., **Bimbraw, K.**, Hammond, F. L. & Weinberg, G. (2018). Comparison and Integration of SMG and EMG. In: *BMES 2018 Annual Meeting*. Atlanta, GA, USA. <u>Poster</u>.

PROFESSIONAL AFFILIATIONS

- Institute of Electrical and Electronics Engineers (IEEE)
- IEEE Robotics & Automation Systems (RAS)
- Biomedical Engineering Society (BMES)
- Association for Computing Machinery (ACM)

REVIEWING

- IEEE Robotics and Automation Letters (IEEE RA-L)
- Medical Image Computing and Computer Assisted Interventions (MICCAI) Advances in Simplifying Medical UltraSound (ASMUS)
- IEEE International Conference on Robotics and Automation (ICRA)
- IEEE International Symposium on Biomedical Imaging (ISBI)

REFERENCES (Contact information available upon request)

Haichong K. Zhang	Toshiaki Koike-Akino
Assistant Professor, Robotics Engineering	Distinguished Research Scientist
Worcester Polytechnic Institute	Mitsubishi Electric Research Laboratories
Ziming Zhang	Jing Liu
Assistant Professor, Electrical & Computer Engineering	Visiting Research Scientist
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Georgia Institute of Technology	Nokia Bell Labs
Ayanna Howard	Michael Eggleston
Dean of Engineering, Monte Ahuja Endowed Dean's Chair	Data & Devices Group Leader,
College of Engineering, The Ohio State University	Nokia Bell Labs

MENTEES

Matthew Hunter	Catherine Pollard
Mentored At: Georgia Tech (VIP)	Mentored At: Worcester Polytechnic Institute (MLSC)
Current Affiliation: Stanford University	Current Affiliation: John Hopkins University
Kevin Greene	Matthew Garza
Mentored At: Worcester Polytechnic Institute (MLSC)	Mentored At: Worcester Polytechnic Institute (REU)
Current Affiliation: Worcester Polytechnic Institute	Current Affiliation: University of Texas