Xiaomin Ouyang

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Research Interest

My main research interest is building AI-powered IoT and mobile systems, with a primary focus on developing efficient machine learning and sensing systems for smart health applications.

- Machine Learning Systems for IoT: addresses real-world challenges for advancing ML in mobile/IoT systems, such as distributed and imperfect IoT data, scalability, limited resources, and real-world system dynamics.
- Smart Health: design and deploy real-world IoT systems for personalized health monitoring and intervention, e.g., developing multi-modal federated learning systems for monitoring digital biomarkers of Alzheimer's Disease.
- Mobile Sensing: enhance sensing quality with physics-strengthened AI techniques, e.g., exposing texture information from ToF cameras for sensing in the dark.

Key words of my recent research: multi-modal sensing and learning, federated learning systems, large language models, activity recognition, digital biomarkers, ToF depth sensing.

Professional Experience

Starting from Aug. 2024

Department of Computer Science and Engineering, HKUST

Clear Water Bay, Kowloon, Hong Kong

Postdoctoral Researcher

Oct. 2023 – Present

ECE Department, University of California, Los Angeles

Advisor: Prof. Mani Srivastava

Los Angeles, CA, U.S.

EDUCATION

Ph.D., Information Engineering

Aug. 2019 – July 2023

The Chinese University of Hong Kong

Hong Kong

Advisor: Prof. Guoliang Xing, Co-Advisor: Prof. Jianwei Huang

B.Eng., Communication and Information Engineering

Sep. 2015 – June 2019

Xiamen University (GPA Rank: 1/68)

Xiamen, China

Selected Awards and Honors

- mHealth Scholars, NIH mHealth Training Institute (mHTI), 2024
- Rising Stars in EECS, Georgia Institute of Technology, 2023
- Outstanding Doctoral Dissertation Award, ACM SIGBED China, 2023
- Best Paper Award (1/198), ACM MobiSys, 2023
- Best Presentation Award of Rising Stars Forum, ACM MobiSys, 2023
- N2Women Young Researcher Fellowship, ACM MobiSys, 2023
- Reaching Out Award, The Chinese University of Hong Kong, 2023
- Student Travel Grant, ACM MobiSys 2023 & ACM MobiCom 2022
- National Scholarship (three times), Highest honor in China, 2018 & 2017 & 2016
- The First Prize (1.8% of 14406 teams), National Undergraduate Electronic Design Contest of China, 2017

Conference Papers

- FlexLoc: Conditional Neural Networks for Zero-Shot Sensor Perspective Invariance in Object Localization with Distributed Multimodal Sensors
 - Jason Wu*, Ziqi Wang*, Xiaomin Ouyang, Ho Lyun Jeong, Colin Samplawski, Lance Kaplan, Benjamin Marlin, Mani Srivastava
 - IEEE/RSJ IROS, 2024 (Acceptance Rate: 47.5%).
- ADMarker: A Multi-Modal Federated Learning System for Monitoring Digital Biomarkers of Alzheimer's Disease
 Xiaomin Ouyang, Xian Shuai, Yang Li, Li Pan, Xifan Zhang, Heming Fu, Sitong Chen, Xinyan Wang, Shihua Cao,
 Jiang Xin, Hazel Mok, Zhenyu Yan, Doris Yu, Timothy Kwok, Guoliang Xing

 ACM MobiCom, 2024 (Winter Acceptance Rate: 23.1%).
- Mozart: A Mobile ToF System for Sensing in the Dark through Phase Manipulation
 Zhiyuan Xie*, <u>Xiaomin Ouyang</u>* (*co-first authors), Li Pan, Wenrui Lu, Guoliang Xing, Xiaoming Liu
 ACM MobiSys, 2023 (Acceptance Rate: 20.7%). Best Paper Award (1 out of 198 submissions)
- Harmony: Heterogeneous Multi-Modal Federated Learning through Disentangled Model Training Xiaomin Ouyang, Zhiyuan Xie, Heming Fu, Sitong Chen, Li Pan, Guoliang Xing, Jiayu Zhou, Jianwei Huang ACM MobiSys, 2023 (Acceptance Rate: 20.7%).
- Cosmo: Contrastive Fusion Learning with Small Data for Multimodal Human Activity Recognition
 <u>Xiaomin Ouyang</u>, Xian Shuai, Jiayu Zhou, Ivy Wang Shi, Zhiyuan Xie, Guoliang Xing, Jianwei Huang

 ACM MobiCom, 2022 (Acceptance Rate: 17.8%).
- ClusterFL: A Similarity-Aware Federated Learning System for Human Activity Recognition
 <u>Xiaomin Ouyang</u>, Zhiyuan Xie, Jiayu Zhou, Jianwei Huang, Guoliang Xing

 ACM MobiSys, 2021 (Acceptance Rate: 21.6%).
- FedDL: Federated Learning via Dynamic Layer Sharing for Human Activity Recognition Linlin Tu, Xiaomin Ouyang, Jiayu Zhou, Yuze He, Guoliang Xing
 ACM SenSys, 2021 (Acceptance Rate: 17.9%).
- UltraDepth: Exposing High-resolution Texture from Depth Cameras Zhiyuan Xie, Xiaomin Ouyang, Xiaoming Liu, Guoliang Xing ACM SenSys, 2021 (Acceptance Rate: 17.9%).

Journal Papers

- ClusterFL: A Clustering-based Federated Learning System for Human Activity Recognition
 <u>Xiaomin Ouyang</u>, Zhiyuan Xie, Jiayu Zhou, Jianwei Huang, Guoliang Xing

 ACM Transactions on Sensor Network, 19(1), 1-32, 2022.
- Optimization Design for Federated Learning in Heterogeneous 6G Networks
 Bing Luo, <u>Xiaomin Ouyang</u>, Peng Sun, Pengchao Han, Ningning Ding, Jianwei Huang
 IEEE Network, 37(2), 38-43, 2023.

Workshop and Demo Papers

- LLMSense: Harnessing LLMs for High-level Reasoning Over Spatiotemporal Sensor Traces Xiaomin Ouyang, Mani Srivastava
 - SenSys-ML Workshop 2024, co-located with CPS-IoT Week 2024.
- Design and Deployment of Multi-Modal Federated Learning Systems for Alzheimer's Monitoring Xiaomin Ouyang
 - ACM MobiSys 2023 Rising Stars Forum. Best Presentation Award
- HiToF: A ToF Camera System for Capturing High-Resolution Textures
 Zhiyuan Xie, Xiaomin Ouyang, Li Pan, Wenrui Lu, Xiaoming Liu, Guoliang Xing
 ACM MobiCom 2022 Demo.

Design and Deployment of a Multi-Modal Federated Learning System for Alzheimer's Disease Monitoring.

Alzheimer's Disease (AD) is a growing health challenge worldwide. Existing approaches for AD diagnosis are usually intrusive and cannot be conducted routinely. We propose ADMarker, the first end-to-end system that integrates multimodal sensors and new federated learning algorithms for detecting multidimensional AD digital biomarkers in natural living environments. We develop a compact multi-modality hardware system that can function for up to months in home environments. On top of the hardware system, we design a multi-modal federated learning system that can accurately detect more than 20 digital biomarkers in a real-time and privacy-preserving manner, which collectively addresses several major real-world challenges such as limited data labels, data heterogeneity, and limited computing resources. Our system has been deployed in a four-week clinical trial involving 91 elderly participants (31 with AD, 30 with mild cognitive impairment, and 30 cognitively normal subjects). The results indicate that ADMarker can accurately detect a comprehensive set of digital biomarkers with up to 93% accuracy and identify AD with an average of 88.9% accuracy.

Multi-Modal Human Activity Recognition (HAR) with Small Data.

Multi-modal sensing systems are essential for capturing complex human activities such as conversation and family meals, which are important digital biomarkers for Alzheimer's disease. However, such systems also bring several new challenges including limited labeled multi-modal data. We propose Cosmo, a new system for multi-modal HAR with only limited labels on the user side. Cosmo features a novel two-stage training strategy that leverages both unlabeled data on the cloud and limited labeled data on edge. By integrating novel fusion-based contrastive learning and quality-guided attention mechanisms, Cosmo can effectively extract both consistent and complementary information across different modalities for efficient fusion. Our evaluation on a cloud-edge testbed using three real-world multi-modal HAR datasets shows that Cosmo delivers significant improvement over state-of-the-art baselines in both recognition accuracy and convergence delay.

A Similarity-Aware Federated Learning System for Privacy-Preserving Activity Recognition.

Federated learning (FL) is a privacy-preserving distributed machine learning approach, which only requires the nodes to upload model weights to avoid exposing users' raw data during the learning process. However, existing FL paradigms yield unsatisfactory performance for a wide class of HAR applications due to the data heterogeneity of different users. We find that, in spite of the heterogeneity, data distributions of different users' activities may share significant spatial-temporal similarity. We propose ClusterFL, a similarity-aware FL system that automatically captures the intrinsic clustering relationship among the data of different users to optimize both the model accuracy and convergence performance. Extensive experiments on an NVIDIA edge testbed using four new HAR datasets show the effectiveness of our approach.

Exposing High-Resolution Texture from ToF Depth Cameras.

Time-of-flight (ToF) depth cameras have been increasingly adopted in various real-world applications, which capture the depth information of the scene. We propose the first system that can generate high-resolution and rich-in-texture maps from off-the-shelf ToF cameras. Through in-depth analysis of the physical reflection model, we design two major approaches to manipulate the phase components for exposing high-resolution textures, including a hardware-based approach by introducing a distorting IR source and a software-based approach through phase manipulation functions. Extensive experiments on off-the-shelf smartphone models and standalone ToF camera platforms show that the output maps of our system deliver significant improvement over existing sensing technologies for various applications.

Teaching and Mentorship

Mentorship

- Oct. 2023 present, Pengrui Quan/Gaofeng Dong/Pragya Sharma/Jason Wu, Ph.D. Students at UCLA (major research projects, with Prof. Mani Srivastava)
- Oct. 2023 present, Yolanda Lau, Ph.D. Student at University College London (invited in the thesis committee)
- Aug. 2022 present, Yang Li, Ph.D. Student at CUHK (major research project, with Prof. Guoliang Xing)
- Aug. 2022 present, Zihan Li, Undergraduate Student at CUHK-SZ (a first-author paper under submission)
- Oct. 2022 May. 2023, Shangcheng Jin, Visiting Undergraduate Student at CUHK (final year project)
- Oct. 2021 May. 2022, Kaiwei Liu, Visiting Undergraduate Student at CUHK (final year project)
- June 2020 Jan. 2021, Qidong Zhai and Nan Zhang, Master Students at CUHK (final year projects)
- Oct. 2019 June. 2020, Hoiying Siu and Jiaying Cheng, Undergraduate Students at CUHK (final year projects)

Teaching

- Teaching Assistant, Computer Networks, CUHK, 2022 Spring/2021 Spring/2020 Spring/2019 Fall
- Laboratory Tutor, Electronic Circuit Design Laboratory, CUHK, 2021 Fall/2020 Fall

Organizing Committee Member

- TPC Chair of International Workshop on Foundation Models for Cyber-Physical Systems & Internet of Things (co-located with CPS-IoT Week 2024)
- Web Chair of ACM/IEEE IPSN 2024
- Organizer of N2Women (Networking Networking Women) Meeting at ACM MobiSys 2023

Program Committee Member

- ACM SenSys 2024
- IEEE ICDCS 2024
- ACM MobiCom 2024 Artifact Evaluation
- ACM MobiSys 2024 Artifact Evaluation
- ACM Ubicom/ISWC 2024 Notes and Briefs
- ACM/IEEE IoTDI Posters/Demos Program, 2023/2024
- ACM SenSys 2022 Shadow Program

Reviewer

- Conference: ACM IMWUT/UbiComp 2022/2023/2024, IEEE INFOCOM 2022, ACM KDD 2021
- Journal: IEEE Transactions on Mobile Computing (TMC), IEEE/ACM Transactions on Networking (ToN), ACM Transactions on Sensor Networks (TOSN), ACM Transactions on Computing for Healthcare, IEEE Internet of Things Journal (IoTJ), International Journal of Computer Vision (IJCV)

Talks

The Hong Kong University of Science and Technology	Mar. 2024
Design and Deployment of AI-powered IoT Systems for Smart Health	
Arizona State University	Feb. 2024
Design and Deployment of AI-powered IoT Systems for Smart Health	
University of Edinburgh	Feb. 2024
Design and Deployment of AI-powered IoT Systems for Smart Health	
EECS Rising Stars Workshop, Georgia Institute of Technology	Nov. 2023
Design and Deployment of AI-powered Mobile Health Systems	
Annual Meeting of the mDOT Center, Harvard University	Oct. 2023
Personalized and Private Health Monitoring and Interventions with LLMs	
Rising Stars Forum of ACM MobiSys 2023, University of Helsinki	June 2023
Design and Deployment of Multi-Modal Federated Learning Systems for Alzheimer's Disease Monitoring	
ACM MobiSys 2023, University of Helsinki	June 2023
Harmony: Heterogeneous Multi-Modal Federated Learning through Disentangled Model Training	
ACM MobiCom 2022, Sydney, Australia	Oct. 2022
Cosmo: Contrastive Fusion Learning with Small Data for Multimodal Human Activity Recognition	
ACM MobiSys 2021, Virtual	June 2021
ClusterFL: A Similarity-Aware Federated Learning System for Human Activity Recognition	

References

Mani Srivastava (Postdoc Advisor)

Professor and Vice Chair

Electrical and Computer Engineering Department

University of California, Los Angeles

Email: mbs@ucla.edu

Jianwei Huang (Ph.D. Co-Advisor)

Presidential Chair Professor and Associate Vice President

School of Science and Engineering

The Chinese University of Hong Kong, Shenzhen

Email: jianweihuang@cuhk.edu.cn

Email: glxing@cuhk.edu.hk

Jiayu Zhou (Thesis Committee, Close Collaborator)

Associate Professor

Professor

Department of Computer Science and Engineering

Michigan State University Email: zhou@cse.msu.edu

Guoliang Xing (Ph.D. Advisor)

Department of Information Engineering

The Chinese University of Hong Kong

Xiaofan (Fred) Jiang (Expertise in Mobile Health and CPS/IoT)

Associate Professor

Department of Electrical Engineering and Computer Engineering

Columbia University

Email: jiang@ee.columbia.edu