# Kaiyi Ji

#### Work Address

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# **Contact Information**

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Sep 2022 – Present

# **Current Position**

tinual Learning, Large-Scale Optimization, Federated Learning and Net	tworks
Education	
The Ohio State University	Columbus, OH, USA
Ph.D., Electrical and Computer Engineering	Sep 2016 – Dec 2023
Advisor: Prof. Yingbin Liang Thesis: Bilevel ontimization for machine learning: Algorithm design and conv	percence analysis 2021
Thesis Committee: Yingbin Liang, Ness B. Shroff, Philip Schniter, Cathy	v Xia
University of Science and Technology of China	Anhui, China
B.S., Electronic Engineering and Information Science	Sep 2012 – Jun 2016
Professional & Industrial Experience	
<b>Postdoctoral Research Fellow, Electrical Engineering and Computer Sci</b> University of Michigan, Ann Arbor, MI, USA Affiliated Postdoc Member with <b>NSF AI-EDGE Institute</b>	<b>ence</b> Sep 2021 – Sep 2022
<ul> <li>Mentor: Prof. Lei Ying</li> <li>Topic: Bilevel Learning for Edge Computing</li> </ul>	
Visiting Student Research Collaborator, Electrical and Computer Engin Princeton University, NLUSA	eering Mar 2020 – Anr 2020
<ul> <li>Mentor: Prof. H. Vincent Poor</li> <li>Topic: Optimization Foundations for Meta-Learning</li> </ul>	
Research Intern (Database Team)	
Alibaba DAMO Academy (US Group), CA, USA	May 2019 – Aug 2019
Topic: Deep Learning for Database System	

# **Grants and Contracts**

Summary of Research Funding Since 2023:

Funding Category	Total	Candidate's Share
Total Funded Research	\$ 1, 100, 000	\$ 550, 190

#### Current Funding

- "Collaborative Research: CIF: Small: New Theory, Algorithms and Applications for Large-Scale Bilevel Optimization," Lead PI: Kaiyi Ji, 08/01/2023 07/31/2026, CIF program, Division of CCF, \$ 300,190 (50% share)
- "Collaborative Research: Distributed Bilevel Optimization in Multi-Agent Systems," PI: Kaiyi Ji, 08/15/2023 07/31/2026, EPCN-Energy-Power-Ctrl-Netwrks, Division of ECCS \$ 250,000 (50% share)

### Pending Funding

• "Collaborative Research: Frameworks: A Unified Open-Source Library for Robot Learning," Co-PI: Kaiyi Ji, 05/2024 - 04/2029, CSSI, my share: \$ 600,000

# **Publications**

Citations: 1039 (h-index: 15, i-index: 21) Google Scholar: https://scholar.google.com/citations?user=E0A31SIAAAAJ&hl=en ORCID: orcid.org/0000-0002-9533-0058

#### <u>Theses</u>

"Bilevel optimization for machine learning: Algorithm design and convergence analysis", Doctoral thesis, The Ohio State University, 2021.

Refereed Proceedings Articles (presenter name underlined; \*: advised student)

- 24. <u>R. Sharma\*</u>, K. Ji, Z. Xu, C. Chen. "AUC-CL: A Batchsize-Robust Framework for Self-Supervised Contrastive Representation Learning," *International Conference on Learning Representations*. [*ICLR* 2024].
- 23. <u>P Xiao\*</u>, <u>H. Ban\*</u>, K. Ji. "Direction-oriented Multi-objective Learning: Simple and Provable Stochastic Algorithms," in *Conference on Neural Information Processing Systems*. [NeurIPS 2023].
- Y. Yang<sup>\*</sup>, P. Xiao<sup>\*</sup>, K. Ji. "SimFBO: Towards Simple, Flexible and Communication-efficient Federated Bilevel Learning," in *Conference on Neural Information Processing Systems*. [NeurIPS spotlight, 2023] [5% acceptance rate].
- 21. Y. Yang<sup>\*</sup>, P. Xiao<sup>\*</sup>, K. Ji. "Achieving  $O(\epsilon^{-1.5})$  Complexity in Hessian/Jacobian-free Stochastic Bilevel Optimization," in *Conference on Neural Information Processing Systems*. [NeurIPS 2023].
- 20. <u>S. Lin</u>, D. Sow, K. Ji, Y. Liang, N. Shroff. "Non-Convex Bilevel Optimization with Time-Varying Objective Functions," in *Conference on Neural Information Processing Systems*. **[NeurIPS 2023]**.
- 19. J. Hao, K. Ji, M. Liu. "Bilevel Coreset Selection in Continual Learning: A New Formulation and Algorithm," in *Conference on Neural Information Processing Systems*. [NeurIPS 2023].
- K. Ji and Lei Ying. "Network Utility Maximization with Unknown Utility Functions: A Distributed, Data-Driven Bilevel Optimization Approach," International Symposium on Theory, Algorithmic Foundations, and Protocol Design for Mobile Networks and Mobile Computing. [MobiHoc 2023].
- 17. M. Huang<sup>\*</sup>, D. Zhang<sup>\*</sup>, K. Ji. "Achieving Linear Speedup in Non-IID Federated Bilevel Learning," in *International Conference on Machine Learning*. **[ICML 2023]**.

- 16. <u>P. Xiao\*</u>, K. Ji. "Communication-Efficient Federated Hypergradient Computation via Aggregated Iterative Differentiation," in *International Conference on Machine Learning*. **[ICML 2023]**.
- 15. <u>D. Sow</u>, K. Ji, Y. Liang. "On the Convergence Theory for Hessian-Free Bilevel Algorithms," in *35nd Conference on Neural Information Processing Systems*. **[NeurIPS, 2022]**.
- 14. K. Ji, M. Liu, Y. Liang, L. Ying. "Will Bilevel Optimizers Benefit from Loops," in 35nd Conference on *Neural Information Processing Systems*. [NeurIPS spotlight, 2022] [5% acceptance rate].
- 13. <u>S. Ma</u>, Z. Chen, Y. Zhou, K. Ji, Y. Liang. "Data Sampling Affects the Complexity of Online SGD over Dependent Data," in *Conference on Uncertainty in Artificial Intelligence*. **[UAI 2022]**.
- 12. J. Yang, K. Ji, Y. Liang. "Provably Faster Algorithms for Bilevel Optimization," in 35nd Conference on Neural Information Processing Systems. [NeurIPS spotlight, 2021] [3% acceptance rate].
- 11. K. Ji, J. Yang, Y. Liang. "Bilevel Optimization: Convergence Analysis and Enhanced Design," in *38th International Conference on Machine Learning*. **[ICML 2021]**.
- 10. K. Ji, J. Lee, Y. Liang, H. Poor. "Convergence of Meta-Learning with Task-Specific Adaptation over Partial Parameters," in *34nd Conference on Neural Information Processing Systems*. [NeurIPS 2020].
- 9. K. Ji, Z. Wang, Y. Zhou, Y. Liang. "History-Gradient Aided Batch Size Adaptation for Variance Reduced Algorithms," *in 37th International Conference on Machine Learning*. **[ICML 2020]**.
- 8. <u>Y. Zhou</u>, Z. Wang, K. Ji, Y. Liang. "Proximal Gradient Algorithm with Momentum and Flexible Parameter Restart for Nonconvex Optimization," *International Joint Conference on Artificial Intelligence*. **[IJCAI 2020]**.
- Z. Guan, K. Ji, D. Bucci Jr, T. Hu, J. Palombo, M. Liston, Y. Liang. "Robust Stochastic Bandit Algorithms under Probabilistic Unbounded Adversarial Attack," in 34th AAAI Conference on Artificial Intelligence. [AAAI spotlight, 2020].
- Z. Wang, K. Ji, Y. Zhou, Y. Liang, V. Tarokh. "SpiderBoost and Momentum: Faster Stochastic Variance Reduction Algorithms," in *33nd Conference on Neural Information Processing Systems*. [NeurIPS 2019].
- K. Ji, Z. Wang, Y. Zhou, Y. Liang. "Improved Zeroth-Order Variance Reduced Algorithms and Analysis for Nonconvex Optimization," in *36th International Conference on Machine Learning*. [ICML 2019].
- 4. <u>K. Ji</u>, Y. Liang. "Minimax Estimation of Neural Net Distance," in 32nd Conference on Neural Information Processing Systems. [NeurIPS 2018].
- 3. K. Ji, G. Quan, J. Tan. "Miss Ratio for LRU Caching with Consistent Hashing," in *IEEE International Conference on Computer Communications*, 2018. **[INFOCOM 2018]**.
- 2. <u>G. Quan</u>, K. Ji, J. Tan. "LRU Caching with Dependent Competing Requests," in *IEEE International Conference on Computer Communications*, 2018. **[INFOCOM 2018]**.
- J. Tan, G. Quan, <u>K. Ji</u>, N. Shroff. "On Resource Pooling and Separation for LRU Caching," in International Conference on Measurement and Modeling of Computer Systems, 2018. [SIGMETRICS 2018]. An extended version has been published in the journal PACM on Measurement and Analysis of Computing Systems. [POMACS 2018].

Refereed Journal Articles (\*: graduate student; +: undergraduate student)

#### Published

- 9. K. Ji and Y. Liang. "Lower Bounds and Accelerated Algorithms for Bilevel Optimization." Journal of Machine Learning Research 24 (2023): 22-1. [JMLR 2023]
- 8. K. Ji, J. Yang, Y. Liang. "Theoretical Convergence of Multi-Step Model-Agnostic Meta-Learning," Journal of Machine Learning Research, 2021. [JMLR 2021]
- 7. K. Ji, Y. Zhou, Y. Liang. "Understanding Estimation and Generalization Error of Generative Adversarial Networks," IEEE Transactions on Information Theory, 2021. **[TIT 2021]**
- 6. Y. Zhang, Y. Zhou, K. Ji, M. Zavlanos. "A New One-Point Residual-Feedback Oracle For Black-Box Learning and Control," Automatica, 2021. [Automatica 2021]
- 5. T. Xu, Y. Zhou, K. Ji, Y. Liang. "When Will Gradient Methods Converge to Max-margin Classifier under ReLU Models ?" Stat, Special Issue of Deep Learning from Statistical Perspective, 2021.
- 4. K. Ji, J. Tan, Y. Chi, J. Xu. "Learning Latent Features with Pairwise Penalties in Matrix Completion," IEEE Transactions on Signal Processing, 2020. [TSP 2020]

#### In Review

- 3. M. Huang, K. Ji, S. Ma, L. Lai. "Efficiently Escaping Saddle Points in Bilevel Optimization." Journal of Machine Learning Research, in revision.
- 2. Y. Zhang, Y. Zhou, K. Ji, and M. M. Zavlanos. "Boosting one-point derivative-free online optimization via residual feedback." IEEE Transactions on Automatic Control, Technical Note, 2023. Accepted with minor revision.
- 1. D. Sow, K. Ji, Z. Guan, Y. Liang. "A Primal-Dual Approach to Bilevel Optimization with Multiple Inner Minima ," Transaction on Machine Learning Research, In First Review, 2023.

# Honors and Awards

AISTATS Top Reviewer Award	2023
Presidential Fellowship, OSU (1-3 per department, highest honor for graduates)	2020-2021
Outstanding Reviewer Award (Top 8%) in NeurIPS, ICML	2020, 2021
University Fellowship, OSU (top honor for fresh graduates)	2016-2019
Outstanding Student Scholarship (1st prize), USTC	2012-2016

# **Technical Presentations**

Invited Talks	
Bilevel Optimization in Continual Learning	
<ul> <li>Asilomar, Pacific Grove, CA</li> </ul>	Nov 2023
Network Utility Maximization via Bilevel Optimization	
<ul> <li>ACM MobiHoc, Washington, DC</li> </ul>	Oct 2023
Bilevel Optimization in Continual Learning	

<ul> <li>INFORMS Annual Meeting, Phoenix, Arizona</li> </ul>	Oct 2023
<b>Stochastic Bilevel Optimization and Application in Continual Learning</b> • SIAM Conference on Optimization, Seattle, Washington	Jun 2023
<b>Bilevel Stochastic Methods for Optimization and Learning</b> O INFORMS Annual Meeting, Indianapolis, IN	Oct 2022
<ul> <li>Co-organizer and Speaker of Invited Session on "Bilevel Machine Learning"</li> <li>Conference on Information Sciences and Systems (CISS) virtually</li> </ul>	Mar 2022
<b>Optimization Theory and Faster Algorithms on Bilevel Learning</b> • Next Generation Transportation Systems (NGTS) Seminar, virtual	Dec 2021
<ul> <li>Meta-Learning: Theoretical Convergence and Algorithms.</li> <li>Presidential Fellowship Winner Seminar, OSU, virtual</li> <li>University of Michigan, Ann Arbor, virtual</li> </ul>	Oct 2020 Aug 2021
<ul> <li>Meta-Learning with Task-Specific Adaptation over Partial Parameters.</li> <li>Neural Information Processing Systems (NeurIPS), spotlight presentation, virtual</li> <li>Machine Learning Seminar, OSU</li> </ul>	Dec 2020 Dec 2020
<b>Learning Latent Features with Pairwise Penalties in Matrix Completion.</b> • IEEE SAM invited talk, virtual	Jul 2020
<ul> <li>History-Gradient Aided Batch Size Adaptation.</li> <li>International Conference of Machine Learning (ICML), oral presentation, virtual</li> </ul>	Jul 2020
<ul> <li>Zeroth-Order (Gradient-Free) Variance Reduced Algorithms.</li> <li>Machine Learning Seminar, OSU</li> <li>International Conference of Machine Learning (ICML), oral presentation, virtual</li> </ul>	May 2019 Jun 2019
Minimax Estimation of Neural Net Distance in GANs. <ul> <li>Machine Learning Seminar, OSU</li> </ul>	Oct 2018
Miss Ratio for LRU Caching with Consistent Hashing. <ul> <li>IEEE INFOCOM, Honolulu, HI, USA</li> </ul>	Apr 2018

# **Graduate Students**

# Dissertations/Theses in Progress Peiyao Xiao NY, USA Ph.D. student, CSE of University at Buffalo Jan 2023– Present • degree expected September 2028 Vork on federated learning, bilevel optimization and multi-task learning • Achievements: totally four papers with me accepted at ICML 2023 and NeurIPS 2023 in one year! Yifan Yang NY, USA

Ph.D. student, CSE of University at Buffalo

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Jan 2023– Present

<ul> <li>Work on federated learning and bilevel optimization</li> <li>Achievements: two papers with me accepted at NeurIPS 2023 with operation</li> </ul>	one <b>spotlight</b> presentation!
<ul> <li>Jue Guo</li> <li>Ph.D. student, CSE of University at Buffalo</li> <li>degree expected September 2028</li> <li>Work on continual learning and transfer learning</li> </ul>	<b>NY, USA</b> Jul 2023– Present
<ul> <li>Hao Ban</li> <li>Incoming Ph.D. student, CSE of University at Buffalo</li> <li>degree expected September 2029</li> <li>Work on multi-task learning</li> <li>Achievements: one paper with me accepted at NeurIPS 2023</li> </ul>	<b>NY, USA</b> Will start in Spring 2024
<ul> <li>Adikavya Gupta Master Student</li> <li>graduated with master degree</li> <li>Work on online meta-learning</li> <li>Achievements: completed one project on online meta-learning</li> </ul>	<b>NY, USA</b> Jan 2023– May 2023

# **Teaching Experience**

o degree expected September 2028

CSE 676, Deep Learning	University at Buffalo	
<ul> <li>Responsibility: Lecture and instructor</li> </ul>	Fall 2023	
CSE 701, Some Recent Progresses in Machine Learning	<b>University at Buffalo</b> Spring 2023	
<ul> <li>Responsibility: Lecture and instructor</li> </ul>		
CSE 712, Optimization for Modern Machine Learning	<b>University at Buffalo</b> Fall 2022	
<ul> <li>Responsibility: Lecture and instructor</li> </ul>		
ECE 8001, Advanced Topics in Communications	The Ohio State University	
<ul> <li>Responsibility: Guest Lecturer</li> </ul>	Fall 2019	
ECE 7005, Information Theory	The Ohio State University	
<ul> <li>Responsibility: Guest Lecturer</li> </ul>	Spring 2019	

# **Professional Activities**

### Leadership

Conference on Information Sciences and Systems (CISS) • Co-organizer Invited Session on "Bilevel Machine Learning", 2022

### Other Service

## **Conference Reviewer**:

- o Artificial Intelligence and Statistics Conference (AISTATS) (top reviewer'23)
- Conference on Neural Information Processing Systems (NeurIPS) (23)

- International Conference on Learning Representations (ICLR) (23)
- International Conference on Machine Learning (ICML) (23)

#### Journal Reviewer:

- IEEE Transactions on Network Science and Engineering
- IEEE Transactions on Intelligent Systems and Technology
- IEEE Transactions on Mobile Computing
- IEEE Transactions on Pattern Analysis and Machine Intelligence
- IEEE Transactions on Signal Processing
- IEEE/ACM Transactions on Networking
- SIAM Journal on Optimization
- Journal of Machine Learning Research
- o Computational Optimization and Applications
- Journal of Scientific Computing
- Machine Learning

Membership in Professional and Honor Societies

- o MobiHoc, Technical Program Committee, Member, March 2023 present
- INFORMS, member, August 2023 present

# **University Service**

#### **Department Committees**

- Chair, Colloquium + UpBeat Committee, September 2023 Present
- Member, Grad Admissions Committee, September 2023 Present
- Member, Colloquium + UpBeat Committee, September 2022 May 2023
- Member, Grad Admissions Committee, September 2022 May 2023