Department of Computer Science University of Liverpool Liverpool, L69 3BX, United Kingdom

# **BEI PENG**

+44 (0) 7957 347 678 bei.peng@liverpool.ac.uk https://beipeng.github.io

#### RESEARCH INTERESTS

Deep Reinforcement Learning, Multi-Agent Systems, Interactive Machine Learning, and Curriculum Learning

# **EDUCATION**

• **Doctor of Philosophy**, Computer Science.

Aug. 2013 – Jul. 2018

Washington State University, Pullman, WA, United States

Advisor: *Matthew E. Taylor* 

Dissertation: Learning from Human Teachers: Supporting How People Want to Teach in Interactive Machine Learning

• Bachelor of Science, Computer Science.

Sep. 2008 – Jun. 2012

Huazhong University of Science & Technology, Wuhan, Hubei, China

# ACADEMIC EMPLOYMENT

• Lecturer (Assistant Professor) in Artificial Intelligence University of Liverpool, Liverpool, United Kingdom

Sep. 2021 – Present

• **Non-Stipendiary Lecturer** in Computer Science *University of Oxford*, Oxford, United Kingdom

Nov. 2019 – Aug. 2021

# • Postdoctoral Researcher

University of Oxford, Oxford, United Kingdom

Jan. 2019 – Aug. 2021

Research on deep reinforcement learning at the Whiteson Research Lab with Prof. Shimon Whiteson

#### • Graduate Research Assistant

Washington State University, Pullman, WA, United States

Jan. 2014 – Feb. 2018

Research on interactive machine learning at the Intelligent Robot Learning Lab with Prof. Matthew E. Taylor

### TEACHING EXPERIENCE

# • University of Liverpool

- COMP310: Multi-Agent Systems (a class of 250 undergraduate students), Lecture, Spring 2022
- Taking the Postgraduate Certificate Academic Practice (PGCAP) program since April 2022, to improve teaching skills and gain professional recognition as a Fellow of the Higher Education Academy (FHEA)

# • University of Oxford

- Artificial Intelligence, *Tutor*, Spring 2020, Spring 2021
- Machine Learning, *Tutor*, Fall 2019, Fall 2020
- Reinforcement Learning, Teaching Assistant, Fall 2019, Fall 2020

# • Washington State University

- Reinforcement Learning, Teaching Assistant, Spring 2015
- Introduction to Computer Architecture, Teaching Assistant, Fall 2013

### SUPERVISION EXPERIENCE

# • University of Liverpool

Sep. 2021 – Present

- I currently have 3 PhD students.
- I currently supervise 11 undergraduate students in their final year projects for the academic year 2022-23.
- I have supervised 4 undergraduate final year projects and 3 master theses in the academic year 2021-22.

# University of Oxford

Jan. 2019 - Aug. 2021

- (co-)Supervised 6 PhD students and 1 master student within/outside Oxford:
  - Tabish Rashid, Christian Schroeder de Witt, Tarun Gupta, Jacob Beck (University of Oxford)
  - Shariq Iqbal (University of Southern California)
  - Ling Pan, Tonghan Wang (Tsinghua University)
- ° (co-)Supervised 4 undergrads in Oxford: Bozhida Vasilev, Kaloyan Aleksiev, Benjamin Slater, Leo Feng.
- The supervision resulted in 2 ICML papers, 2 ICLR papers, 2 NeurIPS papers, and 3 workshop papers.

# **INDUSTRY EXPERIENCE**

• Microsoft Research, Redmond, WA, United States

Oct. 2018 - Dec. 2018

Research Intern

Focused on developing hierarchical deep reinforcement learning algorithms to learn interactive fiction games.

• Borealis AI, Edmonton, Alberta, Canada

Mar. 2018 – Jun. 2018

Research Intern

Focused on developing algorithms to learn sequential decision-making tasks from online evaluative human feedback.

• Tencent AI, Seattle, WA, United States

Aug. 2017 – Nov. 2017

Research Intern

Focused on training the agent to play MOBA game King of Glory using deep supervised learning and RL algorithms.

• Tencent, Wuhan, Hubei, China

Jun. 2012 – May 2013

Front-End Web Developer

Implemented web extensions and web games in mobile platform by JavaScript.

### **PUBLICATIONS**

### **Journal Articles**

[AI Commun'22] Xiaowei Huang, Bei Peng, Xingyu Zhao. Dependable Learning-Enabled Multiagent Systems. *AI Communications, pages 1-14, 2022.* 

[JMLR'20] Sanmit Narvekar, Bei Peng, Matteo Leonetti, Jivko Sinapov, Matthew E. Taylor, Peter Stone. Curriculum Learning for Reinforcement Learning Domains: A Framework and Survey. *Journal of Machine Learning Research*, 2020.

[TETCI'18] Bei Peng, James MacGlashan, Robert Loftin, Michael L. Littman, David L. Roberts, and Matthew E. Taylor. Curriculum Design for Machine Learners in Sequential Decision Tasks. *IEEE Transactions on Emerging Topics in Computational Intelligence*, 2018.

[JAAMAS'16] Robert Loftin, Bei Peng, James MacGlashan, Michael L. Littman, Matthew E. Taylor, Jeff Huang, and David L. Roberts. Learning Behaviors via Human-Delivered Discrete Feedback: Modeling Implicit Feedback Strategies to Speed Up Learning. *Journal of Autonomous Agents and Multi-Agent Systems*, 2016.

# **Conference Papers**

[NeurIPS'21] Bei Peng\*, Tabish Rashid\*, Christian A. Schroeder de Witt\*, Pierre-Alexandre Kamienny, Philip H. S. Torr, Wendelin Böhmer, and Shimon Whiteson. FACMAC: Factored Multi-Agent Centralised Policy Gradients. *In Proceedings of the 35th Conference on Neural Information Systems*, 2021.

[NeurIPS'21] Ling Pan, Tabish Rashid, Bei Peng, Longbo Huang, Shimon Whiteson. Regularized Softmax Deep Multi-Agent Q-Learning. *In Proceedings of the 35th Conference on Neural Information Systems*, 2021.

[ICML'21] Shariq Iqbal, Christian A. Schroeder de Witt, **Bei Peng**, Wendelin Böhmer, Shimon Whiteson, and Fei Sha. Randomized Entity-wise Factorization for Multi-Agent Reinforcement Learning. *In Proceedings of the 38th International Conference on Machine Learning*, 2021.

[ICML'21] Tarun Gupta, Anuj Mahajan, Bei Peng, Wendelin Böhmer, and Shimon Whiteson. UneVEn: Universal Value Exploration for Multi-Agent Reinforcement Learning. *In Proceedings of the 38th International Conference on Machine Learning*, 2021.

[ICLR'21] Tonghan Wang, Tarun Gupta, Anuj Mahajan, Bei Peng, Shimon Whiteson, and Chongjie Zhang. RODE: Learning Roles to Decompose Multi-Agent Tasks. *In Proceedings of the 9th International Conference on Learning Representations*, 2021.

[NeurIPS'20] Tabish Rashid, Gregory Farquhar, Bei Peng, Shimon Whiteson. Weighted QMIX: Expanding Monotonic Value Function Factorisation. *In the 34th Conference on Neural Information Systems*, 2020.

[ICLR'20] Tabish Rashid, Bei Peng, Wendelin Böhmer, Shimon Whiteson. Optimistic Exploration even with a Pessimistic Initialisation. *In Proceedings of the 8th International Conference on Learning Representations*, 2020.

[ICML'17] James MacGlashan, Mark Ho, Robert Loftin, **Bei Peng**, Guan Wang, David L. Roberts, Matthew E. Taylor, and Michael L. Littman. Interactive Learning from Policy-Dependent Human Feedback. *In Proceedings of the 34th International Conference on Machine Learning*, 2017.

[AAMAS'17] Bei Peng, James MacGlashan, Robert Loftin, Michael L. Littman, David L. Roberts, Matthew E. Taylor. Curriculum Design for Machine Learners in Sequential Decision Tasks. *In Proceedings of the 16th International Conference on Autonomous Agents and Multiagent Systems*, 2017.

[AAMAS'16] Bei Peng, James MacGlashan, Robert Loftin, Michael L. Littman, David L. Roberts, Matthew E. Taylor. A Need for Speed: Adapting Agent Action Speed to Improve Task Learning from Non-Expert Humans. *In Proceedings of the 15th International Conference on Autonomous Agents and Multiagent Systems*, 2016.

[IUI'15] Gabriel V. de la Cruz Jr., **Bei Peng**, Walter S. Lasecki, Matthew E. Taylor. Towards Integrating Real Time Crowd Advice with Reinforcement Learning. *In proceedings of the 20th ACM Conference on Intelligent User Interfaces*, 2015.

[RO-MAN'14] Robert Loftin, Bei Peng, James MacGlashan, Michael L. Littman, Matthew E. Taylor, David Roberts, and Jeff Huang. Learning Something from Nothing: Leveraging Implicit Human Feedback Strategies. In IEEE International Symposium on Robot and Human Interactive Communication, 2014.

[AAAI'14] Robert Loftin, James MacGlashan, Bei Peng, Michael L. Littman, Matthew E. Taylor, Jeff Huang, and David L. Roberts. A Strategy-Aware Technique for Learning Behaviors from Discrete Human Feedback. In Proceedings of the 28th AAAI Conference on Artificial Intelligence, 2014.

# **Workshop and Symposium Papers**

Bozhidar Vasilev, Tarun Gupta, **Bei Peng**, Shimon Whiteson. Semi-On-Policy Training for Sample Efficient Multi-Agent Policy Gradients. *In Proceedings of the Adaptive and Learning Agents Workshop (at AAMAS)*, 2021.

Leo Feng, Luisa Zintgraf, **Bei Peng**, Shimon Whiteson. VIABLE: Fast Adaptation via Backpropagating Learned Loss. *In Proceedings of the 3rd Workshop on Meta-Learning (at NeurIPS)*, 2019.

Tabish Rashid, **Bei Peng**, Wendelin Bohmer, and Shimon Whiteson. Optimistic Exploration with Pessimistic Initialization. *In Proceedings of the Exploration in Reinforcement Learning Workshop (at ICML)*, 2019.

**Bei Peng**, James MacGlashan, Robert Loftin, Michael L. Littman, David L. Roberts, and Matthew E. Taylor. Curriculum Design for Machine Learners in Sequential Decision Tasks. *In Proceedings of the Adaptive Learning Agents Workshop (at AAMAS)*, 2017.

Robert Loftin, James MacGlashan, **Bei Peng**, Matthew E. Taylor, Michael L. Littman, and David L. Roberts. Towards Behavior-Aware Model Learning from Human-Generated Trajectories. *In AAAI Fall Symposium on Artificial Intelligence for Human-Robot Interaction, 2016.* 

James MacGlashan, Michael L. Littman, David L. Roberts, Robert Loftin, **Bei Peng**, and Matthew E. Taylor. Convergent Actor Critic by Humans. *In Workshop on Human-Robot Collaboration: Towards Co-Adaptive Learning Through Semi-Autonomy and Shared Control (at IROS*), 2016.

**Bei Peng**, James MacGlashan, Robert Loftin, Michael L. Littman, David L. Roberts, and Matthew E. Taylor. An Empirical Study of Non-Expert Curriculum Design for Machine Learners. *In Proceedings of the Interactive Machine Learning Workshop (at IJCAI)*, 2016.

Mitchell Scott, **Bei Peng**, Madeline Chili, Tanay Nigam, Francis Pascual, Cynthia Matuszek, and Matthew E. Taylor. On the Ability to Provide Demonstrations on a UAS: Observing 90 Untrained Participants Abusing a Flying Robot. *In Proceedings of the AAAI Fall Symposium on Artificial Intelligence and Human Robot Interaction AI-HRI*, 2015.

**Bei Peng**, Robert Loftin, James MacGlashan, Michael L. Littman, Matthew E. Taylor, and David L. Roberts. Language and Policy Learning from Human-delivered Feedback. *In proceedings of the Machine Learning for Social Robotics Workshop (at ICRA)*, 2015.

Gabriel V. de la Cruz Jr., **Bei Peng**, Walter S. Lasecki, and Matthew E. Taylor. Generating Real-Time Crowd Advice to Improve Reinforcement Learning Agents. *In Proceedings of the Learning for General Competency in Video Games workshop (at AAAI)*, 2015.

James Macglashan, Michael L. Littman, Robert Loftin, **Bei Peng**, David Roberts, and Matthew E. Taylor. Training an Agent to Ground Commands with Reward and Punishment. *In Proceedings of the Machine Learning for Interactive Systems workshop (at AAAI)*, 2014.

#### SELECTED TALKS

- Introduction to Reinforcement Learning

  Tutorial at the Centre for Doctoral Training in Distributed Algorithms at Liverpool, November 2022.
- Introduction to Multi-Agent Reinforcement Learning

  Lecture at the CIFAR 2022 Deep Learning + Reinforcement Learning (DLRL) Summer School, July 2022.
- Cooperative Multi-Agent Reinforcement Learning
  Invited Keynote Talk at the Adaptive Learning Agents (ALA) Workshop at AAMAS, May 2022.
- Cooperative Deep Multi-Agent Reinforcement Learning
  Invited Talk at the Centre for Mathematical Imaging Techniques Seminar, University of Liverpool, March 2022.

- Learning from Evaluative Human Feedback Invited Keynote Talk at the Transparent Agency and Learning Workshop, September 2021.
- FACMAC: Factored Multi-Agent Centralised Policy Gradients
  Paper presentation in 35th Conference on Neural Information Processing Systems (NeurIPS), December 2021.
- Analytic Multi-Agent Actor-Critic Algorithms

  Talk at the Whiteson Research Lab, University of Oxford, April 2020.
- Learning Behaviors via Human-Delivered Discrete Feedback Talk at the Whiteson Research Lab, University of Oxford, February 2019.
- Learning from Human Teachers: Supporting How People Want to Teach in Interactive Machine Learning Invited Talk at Microsoft Research, Redmond, WA, United States, July 2018.
- Curriculum Design for Machine Learners in Sequential Decision Tasks

  Paper presentation in the Conference on Autonomous Agents and Multi-agent Systems (AAMAS), May 2017.
- A Need for Speed: Adapting Agent Action Speed to Improve Task Learning from Non-Expert Humans Paper presentation in the Conference on Autonomous Agents and Multi-agent Systems (AAMAS), May 2016.

### AWARDS AND HONORS

- WSU EECS Scholarship for Grace Hopper Celebration Conference, 2017
- AAMAS NSF Scholarship, 2016
- RSJ/KROS Distinguished Interdisciplinary Research Award Finalist for our paper "Learning something from nothing: Leveraging implicit human feedback strategies" at RO-MAN 2014
- Travel Award:
  - Conference on Autonomous Agents and Multi-agent Systems (AAMAS) 2016, 2017
  - International Joint Conferences on Artificial Intelligence (IJCAI) 2016
  - Grad Cohort Workshop for Women 2014, 2015
  - AAAI Conference on Human Computation and Crowdsourcing (HCOMP) 2014
- National Encouragement Scholarship (1%), Huazhong University of Science and Technology, China, 2011
- Model Student of Academic Records (1%), Huazhong University of Science and Technology, China, 2010
- Individual Scholarship (5%), Huazhong University of Science and Technology, China, 2009

#### ACADEMIC SERVICE

- Currently the IPAP (Independent Progress Assessment Panel) member for 11 PhDs at University of Liverpool
  - Responsible for assessing the PhD student's research progress at the end of each year
- Currently the Academic Advisor for 30 undergraduate and graduate students at University of Liverpool
- Currently the Search Committee Member for Lecturers (Assistant Professors) in Computer Science, University of Liverpool, 2022
- External Panel Member for Postdoc Interviews at the Chemistry Department, University of Liverpool, 2022

- PhD Thesis Internal Examiner for James Butterworth, CS Department, University of Liverpool, 2022
- Panel Member for PhD Interviews at the Whiteson Research Lab, University of Oxford, 2020, 2021
- Panel Member for Undergraduate Admission Interviews at the St Catherine's College, University of Oxford, 2019, 2020
- Co-organizer (with Patrick MacAlpine, Patrick Mannion, and Roxana Radulescu), Adaptive Learning Agents (ALA) Workshop at AAMAS 2019
- Co-organizer (with Anna Harutyunyan, Patrick Mannion, and Kaushik Subramanian), Adaptive Learning Agents (ALA) Workshop at AAMAS 2018
- · Conference and Journal Reviewing:
  - International Conference on Learning Representations (ICLR) 2022, 2023
  - IEEE Transactions on Pattern Analysis and Machine Learning, 2022
  - Conference on Neural Information Processing Systems (NeurIPS) 2020, 2021
  - Journal of Machine Learning Research (JMLR) 2021
  - Journal of Artificial Intelligence Research (JAIR) 2020
  - AAAI Conference on Artificial Intelligence (AAAI) 2020
  - International Conference on Autonomous Agents and Multiagent Systems (AAMAS) 2019
  - Adaptive Learning Agents Workshop (ALA) at AAAMAS 2017, 2018, 2019, 2021
  - Scaling-Up Reinforcement Learning Workshop (SURL) at ECML PKDD, 2017, 2019
  - IEEE Geoscience Remote Sensing Letters, 2017
  - Workshop on the Future of Interactive Learning Machines (FILM) at NeurIPS, 2016