## Tianmin Shu

Contact Malone Hall 213 Phone: (310) 948-5180 Information 3400 N Charles St E-mail: tianmin.shu@jhu.edu Baltimore, MD 21218 Website: https://www.tshu.io

RESEARCH Machine Social Intelligence, Embodied AI, Human-Robot Interaction, and Computational Social Interests Cognition.

Johns Hopkins University, Department of Computer Science EMPLOYMENT 01/2024 - Present Assistant Professor

> Johns Hopkins University, Department of Cognitive Science 01/2024 - Present Assistant Professor (by courtesy)

> Massachusetts Institute of Technology 07/2023 - 12/2023

> Research Scientist Advisor: Joshua B. Tenenbaum, Antonio Torralba

Massachusetts Institute of Technology 07/2019 - 07/2023 Postdoctoral Associate Advisor: Joshua B. Tenenbaum, Antonio Torralba

09/2014 - 06/2019 **EDUCATION** University of California, Los Angeles, Los Angeles, CA, USA

Ph.D. in Statistics Advisor: Song-Chun Zhu

09/2010 - 06/2014 Fudan University, Shanghai, China B.S. in Electronic Engineering

EXPERIENCE Facebook AI Research, Menlo Park, CA, USA 06/2018 - 09/2018 Research Intern Mentor: Yuandong Tian

> 06/2017 - 09/2017 Salesforce Research, Palo Alto, CA, USA

> Research Intern Mentor: Caiming Xiong, Richard Socher

Excellent Paper Award, IROS Cognitive and Social Aspects of Human Multi-Robot Interaction SELECTED Honors and AWARDS Best Paper Award, NeurIPS Shared Visual Representations in Human and Machine Intelligence

> Workshop 2020 Best Paper Award, NeurIPS Cooperative AI Workshop 2020 Computational Modeling Prize in Perception/Action, Cognitive Science Society 2017

(\* indicates equal contribution)

Preprints & Under Review

**Publications** 

L. Ying, K. Jha, S. Aarya, J. B. Tenenbaum, A. Torralba, T. Shu. GOMA: Proactive Embodied Cooperative Communication via Goal-Oriented Mental Alignment. arXiv:2403.11075.

Z. Hu\*, T. Shu\*. Language Models, Agent Models, and World Models: The LAW for Machine Reasoning and Planning. arXiv:2312.05230.

C. Jin, Y. Wu, J. Cao, J. Xiang, Y.-L. Kuo, Z. Hu, T. D. Ullman, A. Torralba, J. B. Tenenbaum, T. Shu. MMToM-QA: Multimodal Theory of Mind Question Answering. arXiv:2401.08743.

#### Peer-reviewed Journal Articles

- X. Gao, L. Yuan, **T. Shu**, H. Lu, and S.-C. Zhu. Show Me What You Can Do: Capability Calibration on Reachable Workspace for Human-Robot Collaboration. *IEEE Robotics and Automation Letters* (RA-L), 2022.
- **T. Shu**, Y. Peng, S.-C. Zhu, and H. Lu. A Unified Psychological Space for Human Perception of Physical and Social Events. *Cognitive Psychology*, 128: 101398, 2021.
- Y. Peng, H. Lee, **T. Shu**, and H. Lu. Exploring Biological Motion Perception in Two-stream Convolutional Neural Networks. *Vision Research*, 178: 28-40, 2021.
- Z. Nan, **T. Shu**, R. Gong, S. Wang, P. Wei, S.-C Zhu, and N Zheng. Learning to Infer Human Attention in Daily Activities. *Pattern Recognition*, 103: 107314, 2020.
- D. Xie, **T. Shu**, S. Todorovic, and S.-C. Zhu. Learning and Inferring "Dark Matter" and Predicting Human Intents and Trajectories in Videos. *IEEE Trans. on Pattern Analysis and Machine Intelligence (TPAMI)*, 40(7): 1639-1652, 2018.
- **T.** Shu\*, Y. Peng\*, L. Fan, H. Lu, and S.-C. Zhu. Perception of Human Interaction Based on Motion Trajectories: from Aerial Videos to Decontextualized Animations. *Topics in Cognitive Science (TopiCS)*, 10(1): 225 241, 2018.

### Peer-reviewed Conference Papers

- H. Zhang, W. Du, J. Shan, Q. Zhou, Y. Du, J. B. Tenenbaum, **T. Shu**, and C. Gan. Building Cooperative Embodied Agents Modularly with Large Language Models. *12th International Conference on Learning Representations (ICLR)*, 2024.
- Y. Zhang, P. Robertson, **T. Shu**, S. Hong, and B. Williams. Risk-Bounded Online Team Interventions via Theory of Mind. *IEEE International Conference on Robotics and Automation (ICRA)*, 2024.
- K. Jha, T. A. Le, C. Jin, Y.-L. Kuo, J. B. Tenenbaum, T. Shu. Neural Amortized Inference for Nested Multi-agent Reasoning. 38th AAAI Conference on Artificial Intelligence (AAAI), 2024.
- J. Xiang, T. Tao, Y. Gu, **T. Shu**, Z. Wang, Z. Yang, and Z. Hu. Language Models Meet World Models: Embodied Experiences Enhance Language Models. 37th Annual Conference on Neural Information Processing Systems (NeurIPS), 2023.
- A. Peng, A. Netanyahu, M. K. Ho, **T. Shu**, A. Bobu, J. Shah, P. Agrawal. Diagnosis, Feedback, Adaptation: A Human-in-the-Loop Framework for Test-time Policy Adaptation. 40th International Conference on Machine Learning (ICML), 2023. (Acceptance rate: 1827/6538 = 28%)
- X. Puig\*, **T. Shu**\*, J. B. Tenenbaum, A. Torralba. NOPA: Neurally-guided Online Probabilistic Assistance for Building Socially Intelligent Home Assistants. *IEEE International Conference on Robotics and Automation (ICRA)*, 2023.
- D. Liu, V. Shah, O. Boussif, C. Meo, A. Goyal, **T. Shu**, M. C. Mozer, N. Heess, Y. Bengio. Stateful Active Facilitator: Coordination and Environmental Heterogeneity in Cooperative Multi-Agent Reinforcement Learning. 11th International Conference on Learning Representations (ICLR), 2023. (Acceptance rate: 31.8%)
- R. Tejwani\*, Y.-L. Kuo\*, T. Shu, B. Stankovits, D. Gutfreund, J. B. Tenenbaum, B. Katz,

- and A. Barbu. Zero-shot Linear Combinations of Grounded Social Interactions with Linear Social MDPs. 37th AAAI Conference on Artificial Intelligence (AAAI), 2023. (Acceptance rate: 1721/8777=20%)
- A. Netanyahu\*, **T. Shu**\*, J. B. Tenenbaum, and P. Agrawal. Discovering Generalizable Spatial Goal Representations via Graph-based Active Reward Learning. 39th International Conference on Machine Learning (ICML), 2022. (Acceptance rate: 1235/5630 = 22%)
- M. Deng, J. Wang, C.-P. Hsieh, Y. Wang, H. Guo, **T. Shu**, M. Song, E. Xing and Z. Hu. RLPrompt: Optimizing Discrete Text Prompts with Reinforcement Learning. *Conference on Empirical Methods in Natural Language Processing (EMNLP)*, 2022.
- R. Tejwani\*, Y.-L. Kuo\*, **T. Shu**, B. Stankovits, D. Gutfreund, J. B. Tenenbaum, B. Katz, and A. Barbu. Incorporating Rich Social Interactions Into MDPs. *IEEE International Conference on Robotics and Automation (ICRA)*, 2022. (A short version won **Excellent Paper Award** at IROS Cognitive and Social Aspects of Human Multi-Robot Interaction Workshop, 2022)
- R. Tejwani\*, Y.-L. Kuo\*, **T. Shu**, B. Katz, and A. Barbu. Social Interactions as Recursive MDPs. Conference on Robot Learning (CoRL), 2021. (Acceptance rate: 156/400 = 38%)
- T. Shu, A. Bhandwaldar, C. Gan, K. A. Smith, S. Liu, D. Gutfreund, E. Spelke, J. B. Tenenbaum, and T. D. Ullman. AGENT: A Benchmark for Core Psychological Reasoning. 38th International Conference on Machine Learning (ICML), 2021. (Acceptance rate: 1184/5513 = 21%)
- X. Puig, **T. Shu**, S. Li, Z. Wang, J. B. Tenenbaum, S. Fidler, and A. Torralba. Watch-And-Help: A Challenge for Social Perception and Human-AI Collaboration. *9th International Conference on Learning Representations (ICLR)*, *2021.* (**Spotlight presentation, acceptance rate: 5.6%**; a short version won **Best Paper Award** at NeurIPS Cooperative AI Workshop, 2020)
- A. Netanyahu\*, **T. Shu**\*, B. Katz, A. Barbu, and J. B. Tenenbaum. PHASE: PHysically-grounded Abstract Social Events for Machine Social Perception. *35th AAAI Conference on Artificial Intelligence (AAAI)*, *2021*. (**Acceptance rate: 1692/7911=21%**; short version won **Best Paper Award** at NeurIPS Shared Visual Representations in Human and Machine Intelligence Workshop, 2020)
- **T. Shu**, M. Kryven, T. D. Ullman, and J. B. Tenenbaum. Adventures in Flatland: Perceiving Social Interactions Under Physical Dynamics. 42nd Annual Meeting of the Cognitive Science Society (CogSci), 2020.
- X. Gao\*, R. Gong\*, Y. Zhao, S. Wang, **T. Shu**, and S.-C. Zhu. Joint Mind Modeling for Explanation Generation in Complex Human-Robot Collaborative Tasks. *International Conference on Robot & Human Interactive Communication (RO-MAN)*, 2020.
- H. Wang, W. Wang, **T. Shu**, W. Liang, and J. Shen. Active Visual Information Gathering for Vision-Language Navigation. *European Conference on Computer Vision (ECCV)*, 2020. (Acceptance rate: 1360/5150 = 26%)
- **T. Shu**, Y. Peng, H. Lu, and S.-C. Zhu. Partitioning the Perception of Physical and Social Events Within a Unified Psychological Space. *41st Annual Meeting of the Cognitive Science Society (CogSci)*, 2019. (Oral presentation, acceptance rate: 205/810 = 25.3%)
- T. Shu and Y. Tian. M<sup>3</sup>RL: Mind-aware Multi-agent Management Reinforcement Learning. 7th International Conference on Learning Representations (ICLR), 2019. (Acceptance rate: 525/1591 = 33%)

- P. Wei, Y. Liu, **T. Shu**, N. Zheng, and S.-C. Zhu. Where and Why Are They Looking? Jointly Inferring Human Attention and Intentions in Complex Tasks. *IEEE Conference on Computer Vision and Pattern Recognition (CVPR)*, 2018. (Acceptance rate: 979/3303 = 30%)
- **T. Shu**, C. Xiong, and R. Socher. Hierarchical and Interpretable Skill Acquisition in Multi-task Reinforcement Learning. 6th International Conference on Learning Representations (ICLR), 2018. (Acceptance rate: 337/935 = 36%)
- **T.** Shu\*, Y. Peng\*, L. Fan, H. Lu, and S.-C. Zhu. Inferring Human Interaction from Motion Trajectories in Aerial Videos. 39th Annual Meeting of the Cognitive Science Society (CogSci), 2017. (Oral presentation, acceptance rate: 255/873 = 29%) Computational Modeling Prize
- **T. Shu**, S. Todorovic, and S.-C. Zhu. CERN: Confidence-Energy Recurrent Network for Group Activity Recognition. *IEEE Conference on Computer Vision and Pattern Recognition (CVPR)*, 2017. (Acceptance rate: 783/2680 = 29%)
- **T. Shu**, X. Gao, M. S. Ryoo, and S.-C. Zhu. Learning Social Affordance Grammar from Videos: Transferring Human Interactions to Human-Robot Interactions. *IEEE International Conference on Robotics and Automation (ICRA)*, 2017. (Acceptance rate: 939/2289=41%)
- T. Shu\*, S. Thurman\*, D. Chen, S.-C. Zhu, and H. Lu. Critical Features of Joint Actions that Signal Human Interaction. 38th Annual Meeting of the Cognitive Science Society (CogSci), 2016.
- T. Shu, M. S. Ryoo, and S.-C. Zhu. Learning Social Affordance for Human-Robot Interaction. 25th Internation Joint Conference on Artificial Intelligence (IJCAI), 2016. (Acceptance rate: 558/2294= 24%)
- **T. Shu**, D. Xie, B. Rothrock, S. Todorovic, and S.-C. Zhu. Joint Inference of Groups, Events and Human Roles in Aerial Videos. *IEEE Conference on Computer Vision and Pattern Recognition (CVPR)*, 2015. (Oral presentation, acceptance rate: 71/2123 = 3.3%)

#### Peer-reviewed Workshop Papers

- K. Jha, T. A. Le, C. Jin, Y.-L. Kuo, J. B. Tenenbaum, **T. Shu**. Neural Amortized Inference for Nested Multi-agent Reasoning. *AAAI Summer Symposium*, 2023.
- X. Gao, R. Gong, **T. Shu**, X. Xie, S. Wang, and S.-C. Zhu. VRKitchen: an Interactive 3D Environment for Learning Real Life Cooking Tasks. *ICML Reinforcement Learning for Real Life Workshop*, 2019.
- **T. Shu**, C. Xiong, Y. N. Wu, and S.-C. Zhu. Interactive Agent Modeling by Learning to Probe. *NeurIPS 2018 Deep Reinforcement Learning Workshop*, 2018.

## Peer-reviewed Conference Posters

**T. Shu**, A. Netanyahu, M. Kryven, J. Muchovej, N. Shenoy, B. Katz, A. Barbu, T. D. Ullman, J. B. Tenenbaum. Perceiving social events in a physical world. *The Annual Meeting of the Vision Sciences Society (VSS)*, 2021.

Media Coverage "A fa

"A faster way to teach a robot." MIT News. Jul. 18, 2023

"A framework that could improve the social intelligence of home assistants."  $Tech\ Xplore$ . Jan. 31, 2023

- "A new explainable AI paradigm that could enhance human-robot collaboration." *Tech Xplore*. Aug. 10, 2022
- "Scientists Are Trying to Give Robots Social Skills." Discover Magazine. Jul. 25, 2022
- "Easy for you, tough for a robots." Science News for Students. Nov. 18, 2021
- "Giving robots social skills." MIT News. Nov. 5, 2021
- "Can you teach AI common sense?" VentureBeat. Jul. 27, 2021
- "Researchers design virtual environment to spur development of helpful home robots." *VentureBeat*. Oct. 24, 2020
- "AI can learn real-world skills from playing StarCraft and Minecraft." Science News. May 14, 2019
- "VRKitchen: An interactive virtual environment to train and test AI agents." *Tech Xplore*. Mar. 27, 2019
- "Robots taught to work alongside humans by giving high fives." New Scientist. Apr. 27, 2017

#### INVITED TALKS

- "Cognitively Inspired Machine Theory of Mind."
- Guest lecture for EECS 692: Advanced Artificial Intelligence, University of Michigan, Apr. 8, 2024
- "Benchmarking Human-Level Machine Social Intelligence."
- Cognitive-AI Benchmarking Workshop in Conjunction with CogSci 2023, Jul. 17, 2023
- "Cognitively Inspired Machine Social Intelligence."
- Social Cognitive Neuroscience Lab, University of Iowa, Mar. 3, 2023
- Computational Cognition, Vision, and Learning Group, Johns Hopkins University, Dec. 2, 2022
- Robotics Seminar, University of New Hampshire, Oct. 28, 2022
- University of Maryland, Jul. 25, 2022
- Johns Hopkins University, Jul. 20, 2022
- Vision Seminar, Columbia University, Jun. 29, 2022
- Visual Intelligence for Transportation (VITA) Lab, EPFL, Jan. 5, 2022
- AI Seminar, Information Sciences Institute, USC, Oct. 22, 2021
- "Benchmarking Machine Social Intelligence."
- Sony Computer Science Laboratories, Paris, Feb. 17, 2021
- "Perceiving Social Interactions Under Physical Dynamics."
- Virutal Computational Neuroscience (VCN) Journal Club hosted by Stanford, MIT/Harvard, and Princeton, Nov. 18, 2020
- "A Unified Modeling of Physical and Social Events."
- The Annual Meeting of Multidisciplinary University Initiative (MURI), Edinburgh, UK, Sep. 4, 2019
- "Towards a Better Agent Modeling for Multi-agent Reinforcement Learning."
- CLVR Speaker Series, University of Southern California, Nov. 29, 2018
- "Social Perception on Heider-Simmel Animations."
- The Annual Meeting of Multidisciplinary University Initiative (MURI), White Mountain, NH, Sep. 26, 2018

- "Modeling Human Social Interactions."
- The Annual Meeting of Multidisciplinary University Initiative (MURI), UCLA, Aug. 23, 2017

## "Inferring Human Interactions."

- 3rd Vision Meets Cognition Workshop in Conjunction with CVPR 2017, Honolulu, HI, Jul. 21, 2017

### Professional Service

#### Conference Reviewer:

- CVPR (2017-2023)
- ICCV (2017, 2019, 2021)
- ECCV (2018, 2020, 2022)
- ICLR (2021-2022, 2024)
- NeurIPS (2020-2023)
- ICML (2021-2024)
- AAAI (2019-2022)
- ICRA (2019)
- CoRL (2023-2024)
- HRI (2024)
- IROS (2017, 2019, 2021, 2022)
- RO-MAN (2021)
- CogSci (2022-2024)
- WACV (2021)
- BMVC (2019-2020)
- ACCV (2019)
- PRCV (2019-2020)

#### Journal Reviewer:

- International Journal of Computer Vision (IJCV)
- IEEE Transactions on Image Processing (TIP)
- IEEE Robotics and Automation Letters
- Autonomous Robotics
- Frontiers in Psychology
- Quarterly Journal of Experimental Psychology
- Computers in Industry

## Workshop & Tutorial Organizers:

- AAAI 2024 Tutorial on Language Models Meet World Models
- NeurIPS 2023 Tutorial on Language Models Meet World Models
- RSS 2023 Workshop on Social Intelligence in Humans and Robots
- 1st Challenge on Machine Visual Common Sense: Perception, Prediction, Planning at ECCV 2022
- RSS 2022 Workshop on Social Intelligence in Humans and Robots
- ICRA 2021 Workshop on Social Intelligence in Humans and Robots

## Workshop Committee:

- ICML 2023 Workshop on Theory of Mind in Communicating Agents
- ICML 2023 Workshop on Interactive Learning with Implicit Human Feedback
- ICLR 2021 Workshop on Embodied Multimodal Learning
- NeurIPS 2019 Workshop on Learning with Rich Experience: Integration of Learning Paradigms
- ICML 2018 Workshop on Theoretical Foundations and Applications of Deep Generative Models
- 3rd Vision Meets Cognition Workshop in Conjunction with CVPR 2017

# Department and University Services:

- Student Reviewer, UCLA Computer Science Graduate Admission (2017-2019)
- Grad Student Consultant, the American Statistical Association (ASA) DataFest (2015)

#### Teaching

## Johns Hopkins University, Department of Computer Science

EN 601.473/673: Cognitive Artificial Intelligence

- Instructor

Spring 2024

## Massachusetts Institute of Technology, Department of Brain & Cognitive Sciences

9.66: Computational Cognitive Science

Fall 2020, Fall 2021, Fall 2022

- Project Teaching Assistant

### University of California, Los Angeles, Department of Statistics

STATS 232C: Cognitive Artificial Intelligence

Spring 2018

- Teaching Assistant

STATS 102A: Introduction to Computational Statistics with R

Fall 2017, Winter 2018

- Teaching Assistant

STATS 232A: Statistical Modeling and Learning in Vision and Cognition

Winter 2016

- Teaching Assistant

STATS 130: Getting Up to Speed with SPSS, Stata, SAS, and R

Spring 2015

- Teaching Assistant

#### Mentoring

#### At JHU

### **Undergraduate Students:**

- Darren Shih (2024 present)
- Michael Yi (2024 present)
- Haojun Shi (2024 present)
- Shivam Aary (2024 present)

## Master's Students:

- Yijiang Li (2024 present)
- Xinyu Fang (2024 present)
- Yifan Yin (2024 present)
- Xianglong Wang (2024 present)
- Shunchang Liu (intern, 2023 present)

### At MIT

# Undergraduate Students:

- Jing Cao (2023 present)
- Harry Chen (2023 present)
- Kunal Jha (visiting student from Dartmouth College, 2022 present)
- Hao Liu (visiting student from Tsinghua University, 2023)
- Chuanyang Jin (visiting student from New York University, 2023)
- Andy Wang (2022)
- Karen Chung (2021 2022)
- Nakul Shenoy (2020 2022)
- Annika Magaro (2020 2022)
- Arpan Kaphle (2021)

### Master's Students:

- Yuying Sun (intern from Boston University, 2023 present)
- Yutong Wu (2022 present)
- Yuxin Yan (2022)
- Marwa Abdulhai (2020)

#### At UCLA

## Master's Students:

- Yixin Chen (2017 - 2018; currently Ph.D. student in Statistics at UCLA)

## Undergraduate Students:

- Qingyi Zhao (2018; Master's in Computer Science, UCLA)
- Adam Brownell (2017 2018)
- Xiaofeng Gao (2016 Summer; currently Ph.D. student in Statistics at UCLA)
- Xiaopei Zhang (2015 2018; Master's in Electrical Engineering, UCLA)
- Peimeng Sui (2015 2016; Master's in Data Science, NYU)
- Zhe Ji (2015; Master's in Industrial Engineering & Operations Research, UC Berkeley)