# ANQI LI

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#### RESEARCH INTERESTS

My research focuses on providing theoretical guarantees for robot learning using control theoretic tools. Specific research topics include safe reinforcement learning, learning stable dynamical systems/policies, learning from human demonstrations, and planning & control with formal guarantees.

#### **EDUCATION**

# University of Washington

Ph.D. student in Computer Science & Engineering

· Advisor: Prof. Byron Boots, GPA: 3.96/4.00

# Georgia Institute of Technology

Ph.D. student in Robotics

· Advisors: Prof. Magnus Egerstedt & Prof. Byron Boots, GPA: 4.00/4.00

· Transferred to the University of Washington in Sept. 2019

# Carnegie Mellon University

Masters in Robotics

· Advisor: Prof. Katia Sycara, GPA: 4.00/4.00

Zhejiang University

· GPA: 3.93/4.00, Rank: 1/132

Aug. 2015 – May 2017

Sept. 2011 – July 2015

Aug. 2017 – Aug. 2019

Pittsburgh, PA

Hangzhou, China

Sept. 2019 -

Seattle, WA

Atlanta, GA

Bachelor of Engineering, Automation Major

Sept. 2019 -Seattle, WA

# RESEARCH EXPERIENCE

### University of Washington

Graduate Research Assistant

- · Safe Reinforcement Learning with Structured Policy Classes
  - Introduced a policy class with formal control theoretic guarantees on stability and safety based on the Riemannian Motion Policy (RMP) framework
  - Showed that reinforcement learning on the structured policy class is more safe and efficient on reaching tasks with a simulated three-link robot and a simulated Franka Emika robot.
- · Learning Coordinated Riemannian Motion Policies on Multiple Task Spaces
  - Proposed a framework for end-to-end learning of multiple Riemannian Motion Policies (RMPs) on different task spaces from human demonstrations
  - Demonstrated the proposed framework on a Rethink Sawyer Robot on multiple placing tasks the proposed framework outperforms baselines where the policies are learned individually

- · Learning Stable Policies from Demonstrations through Learning Diffeomorphisms
  - Proposed a framework for representing a complex policy as a simple policy on an latent space related to the original space through a diffeomorphism
  - Designed a neural network architecture for parameterizing diffeomorphism between spaces and the corresponding loss for learning policies on the latent spaces

#### Facebook AI Research

June - Sept. 2021

Research Intern

Remote

- · Learning from Expert Demonstrations under Different Dynamics
  - Considered learning policies from demonstrations when the experts have different embodiment and/or actuation modes
  - Formulated the learning problem as a bilevel optimization problem, with the inner optimization solving (weighted) imitation learning from observations
  - (ongoing) Testing the proposed framework on a set of simulated and real-robot tasks

### **NVIDIA** Research

May – Aug. 2019, June – Sept. 2020

Seattle, WA

Robotics Research Intern

- · RMP<sup>2</sup>: Combining Riemannian Motion Policies with Automatic Differentiation Libraries
  - Designed an algorithm that solves the same optimization problem as RMP flow, but makes use of the gradient oracles from automatic differentiation libraries, e.g., TensorFlow, Pytorch, etc.
  - Achieved a smaller memory footprint than RMP flow and a more intuitive user interface
- · Learning Riemannian Motion Policies from Human Demonstrations
  - Introduced a framework to learn stable Riemannian Motion Policies (RMPs) from human demonstrations through learning potential functions and Riemannian metrics
  - Demonstrated the effectiveness of the proposed learning framework on door reaching and drawer closing tasks performed by a Franka Emika robot

# Georgia Institute of Technology

Aug. 2017 – May 2019

Graduate Research Assistant

Atlanta, GA

- · Multi-objectives Policy Generation for Multi-robot Systems
  - Designed a collection of Riemannian Motion Policies (RMPs) for common multi-robot tasks and showed that many existing potential-based multi-robot controllers can be realized by RMPs
  - Proposed decentralized algorithms to generate control policies for multi-robot systems by combining control policies defined for individual tasks
- · Distributed Second-order Optimization for Multi-agent Systems
  - Designed a distributed truncated Newton's method using consensus protocol as building blocks for a class of multi-agent problems
- · Formally Correct Behavior Composition for Teams of Autonomous Robots
  - Proposed a framework that ensures correct-by-construction behavior composition for teams of autonomous robot using Control Barrier Functions (CBFs)

#### Microsoft Research

Research Intern, CNTK Group

June 2017 – Aug. 2017 Redmond, WA

- · Video Synthesis from Static Images using Generative Adversarial Networks
  - Proposed a deep learning approach to generate videos from static images using Generative Adversarial Networks (GANs)
  - Contributed two tutorials on WGANs, LSGANs and BEGANs for Microsoft Cognitive Toolkit. The tutorial on WGANs and LSGANs are available on the Microsoft CNTK github repository

#### Carnegie Mellon University

Graduate Research Assistant

Oct. 2015 – May 2017 Pittsburgh, PA

- · Topology-Based Coordination for Large Teams of Robots
  - Proposed a decentralized and behavior-based approach for large groups of robots to navigate in unknown environments while preserving connectivity and avoiding collisions
- · State Abstraction for Multi-robot Systems under Uncertainty
  - Designed distributed asynchronous algorithms to abstract high dimensional state information of multi-robot systems with the state information of a subset of robots under state uncertainty
- · Human Action Prediction with Recurrent Neural Networks
  - Developed a Recurrent Neural Network (RNN) model with Long Short-Term Memory (LSTM) architecture to predict human actions in Cyber-physical Systems

#### **PUBLICATIONS**

(\* indicates equal contribution)

#### Journal Publication

[J1] P. Pierpaoli, A. Li, M. Srinivasan, X. Cai, S. Coogan, and M. Egerstedt, "A Sequential Composition Framework for Coordinating Multi-robot Behaviors." IEEE Transactions on Robotics (T-RO), 2020

#### Conference Publications

- [C13] M. A. Rana\*, A. Li\*, D. Fox, S. Chernova, B. Boots, and N. Ratliff, "Towards Coordinated Robot Motions: End-to-End Learning of Motion Policies on Transform Trees." IEEE/RSJ International Conference on Intelligent Robots and Systems (IROS), 2021
- [C12] A. Li\*, C.-A. Cheng\*, M. A. Rana, M. Xie, K. Van Wyk, N. Ratliff, and B. Boot, "RMP<sup>2</sup>: A Structured Composable Policy Class for Robot Learning." *Robotics: Science and Systems (R:SS)*, 2021
- [C11] J. Urain, A. Li, P. Liu, C. D'Eramo, and J. Peters, "Composable Energy Policies for Reactive Motion Generation and Reinforcement Learning." Robotics: Science and Systems (R:SS), 2021
- [C10] N. Ratliff, K. Van Wyk, M. Xie, A. Li, and M. A. Rana, "Generalized Nonlinear and Finsler Geometry for Robotics." IEEE Conference on Robotics and Automation (ICRA), 2021
- [C9] M. A. Rana, A. Li, D. Fox, B. Boots, F. Ramos, and N. Ratliff, "Euclideanizing Flows: Diffeomorphic Reductions for Learning Stable Dynamical Systems." Conference on Learning for Dynamics and Control (L4DC), 2020

- [C8] A. Li, and C.-A. Cheng, B. Boots, and M. Egerstedt, "Stable, Concurrent Controller Composition for Multi-Objective Robotic Tasks." *IEEE Conference on Decision and Control (CDC)*, 2019
- [C7] M. A. Rana\*, A. Li\*, H. Ravichandar, M. Mukadam, S. Chernova, D. Fox, B. Boots, and N. Ratliff, "Learning Reactive Motion Policies in Multiple Task Spaces from Human Demonstrations." Conference on Robot Learning (CoRL), 2019
- [C6] A. Li, M. Mukadam, M. Egerstedt, and B. Boots, "Multi-Objective Policy Generation for Multi-Robot Systems Using Riemannian Motion Policies." International Symposium on Robotics Research (ISRR), 2019
- [C5] A. Li, and M. Egerstedt, "On the Trade-Off Between Communication and Execution Overhead for Control of Multi-Agent Systems." American Control Conference (ACC), 2019
- [C4] A. Li, L. Wang, P. Pierpaoli, and M. Egerstedt, "Formally Correct Composition of Coordinated Behaviors Using Control Barrier Certificates." IEEE/RSJ International Conference on Intelligent Robots and Systems (IROS), 2018
- [C3] A. Li, W. Luo, S. Nagavalli, and K. Sycara, "Decentralized Coordinated Motion for a Large Team of Robots Preserving Connectivity and Avoiding Collisions." *IEEE Conference on Robotics and Automation (ICRA)*, 2017
- [C2] A. Li, W. Luo, S. Nagavalli, N. Chakraborty, and K. Sycara, "Handling State Uncertainty in Distributed Information Leader Selection for Robotics Swarms." IEEE Conference on System, Man and Cybernetics (SMC), 2016
- [C1] A. Li, M. Lewis, C. Lebiere, K. Sycara, S. S. Khatib, Y. Tang, M. Siedsma, and D. Morrison, "A Computational Model Based on Human Performance for Fluid Management in Critical Care." IEEE Symposium Series on Computational Intelligence (SSCI), 2016

# Workshop Paper

[W1] A. Li\*, C.-A. Cheng\*, M. A. Rana, N. Ratliff, and B. Boot, "RMP<sup>2</sup>: a Differentiable Policy Class for Robotic Systems with Control-Theoretic Guarantees." 3rd NeurIPS Workshop on Robot Learning, 2020; Microsoft Reinforcement Learning Day, 2021

# Preprints & Technical Reports

- [TR5] M. Xie, A. Li, K. Van Wyk, F. Dellaert, B. Boots, and N. Ratliff, "Imitation Learning via Simultaneous Optimization of Policies and Auxiliary Trajectories.", arXiv preprint arXiv:2105.03019, 2021
- [TR4] N. Ratliff, K. Van Wyk, M. Xie, A. Li, and M. A. Rana, "Optimization Fabrics for Behavioral Design.", arXiv preprint arXiv:2010.15676, 2020
- [TR3] M. Xie, K. Van Wyk, A. Li, M. A. Rana, D. Fox, B. Boots, and N. Ratliff, "Geometric Fabrics for the Acceleration-based Design of Robotic Motion.", arXiv preprint arXiv:2010.14750, 2020
- [TR2] N. Ratliff, K. Van Wyk, M. Xie, A. Li, and M. A. Rana, "Optimization Fabrics.", arXiv preprint arXiv:2008.02399, 2020
- [TR1] P. Pierpaoli, H. Ravichandar, N. Waytowich, A. Li, D. Asher, and M. Egerstedt, "Inferring and Learning Multi-Robot Policies by Observing an Expert.", arXiv preprint arXiv:1909.07887, 2019

#### Thesis

[T1] A. Li, "Decentralized Coordinated Motion for Robot Teams Preserving Connectivity and Avoiding Collisions.", Master's Thesis, Carnegie Mellon University, 2017

#### INVITED TALKS & POSTERS

# Learning Reactive Robot Motion Policies with Control-theoretic Guarantees

- Microsoft Research AI Breakthroughs, September 2020
- Robotics Colloquium@UW, November 2020
- NVIDIA GTC, April 2021
- Robotics Seminar@UIUC, May 2021

# Safe and Efficient Robot Learning Using Riemannian Motion Policies

• R:SS'21 Workshop on Geometry and Topology in Robotics

### **HONORS**

- NVIDIA Graduate Fellowship (5 worldwide)	2020
– Georgia Robotics Fellowship	2017
- ICRA RAS Travel Grant	2017
- GSA Conference Funding, CMU	2016, 2017
- Siebel Scholar Class of 2017 (72 worldwide)	2016
- Outstanding Graduate (top 5%), ZJU	2015
– Excellent Undergraduate Thesis Award (top 10%), ZJU	2015
- Chu Kochen Scholarship (top 0.2%, highest honor), ZJU	2014
– National Scholarship (top 1%), China	2013
– First-Class Scholarship for Outstanding Students (top $3\%),\mathrm{ZJU}$	2013, 2014
– Excellent Student Awards, ZJU	2012,2013,2014

# LEADERSHIP AND PROFESSIONAL SERVICE

- Research Breakout Room Host, Allen School Women's Research Day
- 2021
- Shared research and career development experience with women undergraduate researchers
- Reader, Allen School of Computer Science & Engineering, University of Washington 2020 2021
  - Computer Science & Engineering Ph.D. Admissions
  - Pre-Application Review Service (PARS)\*
    - Provided feedback on 5 prospective students' Ph.D. application packages
    - \* The PARS program is especially designed to assist PhD applicants from underrepresented communities and related organizations
- Member of Executive Board, RoboGrads, Georgia Institute of Technology

2018 - 2019

- President (May Aug. 2019), Vice-President Academics (May 2018 May 2019)
- Initiated faculty-student lunch events in the robotics community
- Organized student seminars where students present their research to their peers

- Reviewer
  - Journals: IEEE Robotics and Automation Letters (RA-L); European Journal of Control (EJC)
  - Conferences: IEEE International Conference on Robotics and Automation (ICRA); Robotics: Science and Systems (R:SS); Conference on Robot Learning (CoRL); IEEE/RSJ International Conference on Intelligent Robots and Systems (IROS); IEEE Conference on Decision and Control (CDC); IEEE International Conference on Robot & Human Interactive Communication (ROMAN)
  - Workshop: NeurIPS Workshop on Imitation Learning and its Challenges in Robotics

#### TEACHING EXPERIENCE

# University of Washington

Mar. 2020 – June 2020

Graduate Teaching Assistant

Seattle, WA

- CSE-599W: Reinforcement Learning, Spring 2020, Instructor: Prof. Byron Boots

# Georgia Institute of Technology

 $Jan.\ 2018-May\ 2018$ 

Graduate Teaching Assistant

Atlanta, GA

- CS-3630: Introduction to Robotics and Perception, Spring 2018, Instructor: Prof. Sonia Chernova

# **SKILLS**

Programming Laguages

Python, MATLAB, C/C++, Java, R

Open Sourse Libraries PyTorch, Tensorflow, CNTK, Keras, OpenAI Gym, MuJoCo, ROS