# Boris Ivanovic

RESEARCH SCIENTIST · NVIDIA AUTONOMOUS VEHICLE RESEARCH GROUP Santa Clara. California. USA

Sarita Ciara, California, USA

# **Education**

Stanford University September 2018 - December 2021

Doctor of Philosophy (PhD) - Aeronautics and Astronautics

Stanford, CA - USA

• Conducted research at the intersection of robotics and deep learning under Prof. Marco Pavone, focusing on autonomous vehicles.

• Head Course Assistant for AA 274A: Principles of Robot Autonomy I.

Stanford University September 2016 - June 2018

Master of Science (MS) - Computer Science

Stanford, CA - USA

- Conducted research in machine learning, computer vision, robotics, and data science.
- Course Assistant for CS231A: Computer Vision From 3D Reconstruction to Recognition.

University of Toronto September 2012 - June 2016

Bachelor of Applied Science (BASc) with High Honours - Engineering Science - GPA: 3.93

Toronto, ON - Canada

- Undergraduate thesis with Professors Raquel Urtasun and Sanja Fidler in Visual SLAM and 3D Scene Segmentation.
- Award-winning TA for CSC411: Introduction to Machine Learning.
- Won the final AER201: Engineering Design competition.
- Ranked in the top 10% of Engineering Science students.

# **Publications**

#### **Preprints**

Heterogeneous-Agent Trajectory Forecasting Incorporating Class Uncertainty

B. Ivanovic, K-H. Lee, P. Tokmakov, B. Wulfe, R. McAllister, A. Gaidon, M. Pavone

Under review, 2022

#### **Journal Articles**

Multimodal Deep Generative Models for Trajectory Prediction: A Conditional Variational Autoencoder Approach **B. Ivanovic\***, K. Leung\*, E. Schmerling, M. Pavone (\* denotes equal contribution)

IEEE Robotics and Automation Letters (RA-L) 6.2 (Apr. 2021) pp. 295–302. 2021

#### **Conference Papers**

#### Injecting Planning-Awareness into Prediction and Detection Evaluation

B. Ivanovic, M. Pavone

IEEE Intelligent Vehicles Symposium (IV), 2022, Aachen, Germany

#### MTP: Multi-hypothesis Tracking and Prediction for Reduced Error Propagation

X. Weng, B. Ivanovic, M. Pavone

IEEE Intelligent Vehicles Symposium (IV), 2022, Aachen, Germany

#### Sample-Efficient Safety Assurances using Conformal Prediction

R. Luo, S. Zhao, J. Kuck, **B. Ivanovic**, S. Savarese, E. Schmerling, M. Pavone

Workshop on the Algorithmic Foundations of Robotics (WAFR), 2022, College Park, MD, USA

#### Whose Track Is It Anyway? Improving Robustness to Tracking Errors with Affinity-Based Prediction

X. Weng, B. Ivanovic, M. Pavone

IEEE/CVF Conference on Computer Vision and Pattern Recognition (CVPR), 2022, New Orleans, USA

### ScePT: Scene-consistent, Policy-based Trajectory Predictions for Planning

Y. Chen, B. Ivanovic, M. Pavone

IEEE/CVF Conference on Computer Vision and Pattern Recognition (CVPR), 2022, New Orleans, USA

#### Propagating State Uncertainty Through Trajectory Forecasting

B. Ivanovic, Y. Lin, S. Shrivastava, P. Chakravarty, M. Pavone

IEEE International Conference on Robotics and Automation (ICRA), 2022, Philadelphia, USA

## Leveraging Neural Network Gradients within Trajectory Optimization for Proactive Human-Robot Interactions

S. Schaefer, K. Leung, B. Ivanovic, M. Pavone

IEEE International Conference on Robotics and Automation (ICRA), 2021, Xi'an, China

#### MATS: An Interpretable Trajectory Forecasting Representation for Planning and Control

B. Ivanovic, A. Elhafsi, G. Rosman, A. Gaidon, M. Pavone

Conference on Robot Learning (CoRL), 2020, Virtual

#### Evidential Sparsification of Multimodal Latent Spaces in Conditional Variational Autoencoders

M. Itkina, B. Ivanovic, R. Senanayake, M. J. Kochenderfer, M. Pavone

Advances in Neural Information Processing Systems (NeurIPS), 2020, Virtual

# Risk-Sensitive Sequential Action Control with Multi-Modal Human Trajectory Forecasting for Safe Crowd-Robot Interaction

H. Nishimura, B. Ivanovic, A. Gaidon, M. Pavone, M. Schwager

IEEE/RSJ International Conference on Intelligent Robots and Systems (IROS), 2020, Virtual

# Trajectron++: Dynamically-Feasible Trajectory Forecasting With Heterogeneous Data

T. Salzmann\*, **B. Ivanovic\***, P. Chakravarty, M. Pavone (\* denotes equal contribution)

#### 3rd place in the ICRA 2020 nuScenes Prediction Challenge

European Conference on Computer Vision (ECCV), 2020, Virtual

#### Map-Predictive Motion Planning in Unknown Environments

A. Elhafsi, B. Ivanovic, L. Janson, M. Pavone

IEEE International Conference on Robotics and Automation (ICRA), 2020, Virtual

#### The Trajectron: Probabilistic Multi-Agent Trajectory Modeling with Dynamic Spatiotemporal Graphs

B. Ivanovic, M. Pavone

IEEE/CVF International Conference on Computer Vision (ICCV), 2019, Seoul, South Korea

# BaRC: Backward Reachability Curriculum for Robotic Reinforcement Learning

B. Ivanovic, J. Harrison, A. Sharma, M. Chen, M. Pavone

IEEE International Conference on Robotics and Automation (ICRA), 2019, Montreal, Canada

#### Generative Modeling of Multimodal Multi-Human Behavior

B. Ivanovic, E. Schmerling, K. Leung, M. Pavone

IEEE/RSJ International Conference on Intelligent Robots and Systems (IROS), 2018, Madrid, Spain

#### ADAPT: Zero-Shot Adaptive Policy Transfer for Stochastic Dynamical Systems

J. Harrison, A. Garg, **B. Ivanovic**, Y. Zhu, S. Savarese, L. Fei-Fei, M. Pavone

International Symposium on Robotics Research (ISRR), 2017, Puerto Varas, Chile

#### **Theses**

#### Trajectory Forecasting in the Modern Robotic Autonomy Stack

**B.** Ivanovic

Stanford University, 2021

#### Streamlining the Training of 3D Scene Segmentation Models

**B.** Ivanovic

University of Toronto, 2016

## **Blog Posts**

# Back to the Future: Planning-Aware Trajectory Forecasting for Autonomous Driving

**B.** Ivanovic

Stanford Artificial Intelligence Lab (SAIL) Blog, 2020

#### How to Deploy Deep Learning Models with AWS Lambda and TensorFlow

B. Ivanovic, Z. Ivanovic

#### 5th most viewed blog post in all of AWS in 2018

Amazon Web Services (AWS) AI Blog, 2017

# **Experience**

**NVIDIA Research** January 2022 - Present

Research Scientist Santa Clara, CA - USA

· Working in the Autonomous Vehicle Research Group on novel trajectory forecasting methods and their integration within the autonomy stack.

**NVIDIA Research** March 2021 - September 2021

Research Scientist Intern Santa Clara, CA - USA

• Worked in the Autonomous Vehicle Research Group on novel trajectory forecasting methods and their integration within the autonomy stack.

#### **Toyota Research Institute**

June 2020 - September 2020

Research Scientist Intern

Los Altos, CA - USA

· Worked with Adrien Gaidon on novel trajectory forecasting methods in the Machine Learning Research team.

Amazon.com June 2017 - September 2017

Prime Air SDE Intern

Seattle, WA - USA

- Worked with Principal Research Scientist Ishay Kamon in the Autonomy team.
- Designed and implemented a novel state-of-the-art deep learning approach for a specific computer vision task within the team, outperforming existing models by 10x. The project was completed successfully and a full-time Research Scientist return offer was extended.

Amazon.com *May 2016 - August 2016* 

Prime Air SDE Intern

Seattle, WA - USA

- · Worked with former NASA Astronaut Neil Woodward in the Flight Test team.
- · Designed and built fault-tolerant, scalable software and hardware to autonomously collect and process relevant flight test data from numerous locations for internal consumption.

**ETH Zurich** *May 2015 - August 2015* 

Summer Research Intern

Zurich - Switzerland

- · Worked with Professor Raffaello D'Andrea in the Institute for Dynamic Systems and Control, specifically the Flying Machine Arena.
- · Removed superfluous code from an open source motor controller and implemented new features such as motor calibration, emergency safety states, and a better motor startup routine in C. Simulated dynamic motor and propeller system responses in Python.

Amazon.com May 2014 - July 2014

SDE Intern

Seattle, WA - USA

· Worked in the Demand Forecasting team creating a real-time demand forecasting simulation tool. Used the Hadoop MapReduce framework to process large amounts of simulation data generated by a machine learning module. The project was completed successfully and a return offer was extended.

# **Awards**

#### **NSERC Doctoral Canada Graduate Scholarship (CGS-D)**

May 2020 - December 2021

National Sciences and Engineering Research Council (NSERC)

Canada

The CGS-D Program promotes continued excellence in Canadian research by rewarding high-calibre Canadian doctoral students pursuing studies at home or abroad.

#### **Engineering Science Award of Excellence**

May 2016

University of Toronto

University of Toronto

Toronto, ON - Canada

Received for maintaining a CGPA greater than 3.90.

**Computer Science TA Award** 

May 2016 Toronto, ON - Canada

Received for being the best Computer Science TA in the Winter 2016 semester.

NSERC Master's Postgraduate Scholarship (CGS-M) (Declined)

April 2016

National Sciences and Engineering Research Council (NSERC)

Canada

The CGS-M Program provides financial support to high-calibre scholars who are engaged in eligible master's programs in Canada.

**Dean's Honour List** September 2012 - June 2016

University of Toronto Toronto, ON - Canada

Placed on the Dean's Honour List for all undergraduate semesters.

**University of Toronto Scholarship** 

September 2012

University of Toronto Toronto, ON - Canada

Received for being one of the top 300 entrants to the University of Toronto in 2012.



**Programming** Python, Java, C/C++, MATLAB, R, Scala, Verilog, Assembly, Web (HTML5/CSS3/JavaScript)

**Learning & Robotics** PyTorch, TensorFlow, MXNet, Theano, MuJoCo, Box2D, MazeBase, ROS

**Data Science** NumPy, Pandas, Seaborn, Matplotlib, StatsModels

**Libraries/SDKs** Amazon Web Services SDK, Hadoop, Spark, Node.js, Google Web Tools, Android SDK

# Service\_

 $\textbf{ICLR}\ (2022), \textbf{CVPR}\ (2021, 2022), \textbf{ECCV}\ (2022), \textbf{ICML}\ (2020, 2021, 2022), \textbf{NeurIPS}\ (2019, 2020, 2021), \textbf{RSS}\ (2020, 2021), \textbf{ICRA}\ (2020, 2021, 2022), \textbf{NeurIPS}\ (2019, 2020, 2021), \textbf{RSS}\ (2020, 20$ 

**Reviewing** 2022), **IROS** (2021, 2022), **CDC** (2021), **Humanoids** (2020), **IV** (2021, 2022), **ITSC** (2019), **TPAMI** (2020), **RA-L** (2020, 2021, 2022),

**L-CSS** (2021), **TMLR** (2022)