# Nicholas Rhinehart

Email: nick.rhinehart@utoronto.ca Homepage: http://nrhinehart.github.io

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# **Current Position**

University of Toronto, Institute for Aerospace Studies, affiliated with the Robotics Institute Assistant Professor	Jul 2024 – Present
Education	
Carnegie Mellon University, The Robotics Institute of the School of Computer Science Doctor of Philosophy in Robotics Adviser: Kris Kitani	Aug 2014 – Sep 2019
Carnegie Mellon University, The Robotics Institute of the School of Computer Science Master of Science in Robotics Adviser: Drew Bagnell	Jan 2013 – Aug 2014
Swarthmore College Bachelor of Arts in Computer Science, Bachelor of Science in Engineering	Aug 2008 – May 2012
Professional Experience	
<b>University of Toronto</b> , Institute for Aerospace Studies, affiliated with the Robotics Institute Assistant Professor	Jul 2024 – Present
<b>Waymo Research</b> , Waymo, Alphabet Senior Research Scientist	Nov 2022 – Jun 2024
University of California, Berkeley, EECS Department, Berkeley A.I. Research (BAIR) Postdoctoral Scholar with Sergey Levine	Oct 2019 – Sep 2022
University of California, Berkeley, EECS Department, Berkeley A.I. Research (BAIR) Visiting Researcher with Sergey Levine	Jun 2018 – Nov 2018
NEC Labs America, Media Analytics Department Research Assistant with Paul Vernaza	May 2017 – Sep 2017
Uber Advanced Technologies Group Research Engineer with Drew Bagnell	Jun 2016 – Sep 2016
University of Tokyo, Institute of Industrial Science Visiting Researcher with Kris Kitani	Jun 2015 – July 2015
<b>Carnegie Mellon University</b> , The Robotics Institute of the School of Computer Science Doctoral Student Researcher with Kris Kitani	Aug 2014 – Sep 2019
<b>Carnegie Mellon University</b> , The Robotics Institute of the School of Computer Science Master's Student Researcher with Drew Bagnell	Jan 2013 – Aug 2014

# **Academic Awards**

Paper Awards

# Best Paper Award, ICML 2019 Workshop on AI for Autonomous Driving

2019

For the paper: PRECOG (Rhinehart et al.)

## **Best Paper Award Honorable Mention, ICCV 2017**

2017

For the paper: First-Person Activity Forecasting (Rhinehart et al.). Awarded to 3 of 2,143 submissions.

#### FELLOWSHIP AWARDS

#### PhD Fellowship, Center for Machine Learning and Health

2018

Awarded full tuition and funds for Automatic Forecasting and Understanding of Behavior research proposal

#### **IBM PhD Fellowship Finalist**

2017

Nominated as one of three CMU Robotics Institute candidates for the IBM PhD Fellowship

#### The Robert E., Elizabeth, and Walter Lamb Scholarship, Swarthmore College

2011, 2012

Awarded scholarships on the bases of academic merit and financial need.

# Professional Service Awards

# Top Reviewer Award (x4)

2019, 2019, 2021, 2021

NeurIPS 2021 · ICML 2021 · NeurIPS 2019 · ICCV 2019

Recognized for contributions to the reviewing process.

# **Funding Awards**

#### Toyota Research Institute, Co-Investigator.

2021-2024

\$1,125,000 to study "Unified Predictive Representations for Multi-agent Modeling, Tracking, Forecasting, and Control".

#### Fellowship, CMU Center for Machine Learning and Health.

2019

\$85,000 (tuition, stipend, and discretionary funds) to study "Automatic Forecasting and Understanding of Behavior".

#### Travel Grant (x5): NeurIPS (x2), CMU Provost (x2), ICRA

{2018, 2015}, {2017, 2016}, 2017

Financial conference travel support.

#### Hardware Grant: NVIDIA

2014

Granted GPU.

#### **Publications**

#### Conference and Journal Publications

[1] CARFF: Conditional Auto-encoded Radiance Field for 3D Scene Forecasting

J. Yang, K. Desai, C. Packer, H. Bhatia, N. Rhinehart, R. McAllister, J. Gonzalez

European Conference on Computer Vision (ECCV), 2024.

[2] The Waymo Open Sim Agents Challenge

N. Montali, J. Lambert, P. Mougin, A. Kuefler, N. Rhinehart, M. Li, C. Gulino, T. Emrich, Z. Yang, S. Whiteson, B. White,

D. Anguelov

Neural Information Processing Systems (NeurIPS), 2023.

[3] Offline Reinforcement Learning for Customizable Visual Navigation

D. Shah, A. Bhorkar, H. Leen, I. Kostrikov, N. Rhinehart, S. Levine

Conference on Robot Learning (CoRL), 2022.

[4] Is Anyone There? Learning a Planner Contingent on Perceptual Uncertainty
C. Packer, N. Rhinehart, R. McAllister, M. A. Wright, X. Wang, J. He, S. Levine, J. E. Gonzalez
Conference on Robot Learning (CoRL), 2022.

[5] S2Net: Stochastic Sequential Pointcloud Forecasting

X. Weng, J. Nan, K. Lee, R. McAllister, A. Gaidon, **N. Rhinehart**, K. Kitani. European Conference on Computer Vision (**ECCV**), 2022.

[6] Hybrid Imitative Planning with Geometric and Predictive Costs in Off-road Environments N. Dashora\*, D. Shin\*, D. Shah, H. Leopold, D. Fan, A. Agha-Mohammadi, N. Rhinehart, S. Levine. International Conference on Robotics Automation (ICRA), 2022.

[7] Information is Power: Intrinsic Control via Information Capture
N. Rhinehart, J. Wang, G. Berseth, JD Co-Reyes, D. Hafner, C. Finn, S. Levine

Neural Information Processing Systems (**NeurIPS**), 2021.

[8] RECON: Rapid Exploration for Open-World Navigation with Latent Goal Models D. Shah, B. Eysenbach, N. Rhinehart, S. Levine Oral Presentation, Conference on Robot Learning (CoRL), 2021.

[9] Contingencies from Observations: Tractable Contingency Planning with Learned Behavior Models N. Rhinehart\*, J. He\*, C. Packer, M. A. Wright, R. McAllister, J. E. Gonzalez, S. Levine International Conference on Robotics and Automation (ICRA), 2021.

ViNG: Learning Open-World Navigation with Visual Goals
 D. Shah, B. Eysenbach, G. Kahn, N. Rhinehart, S. Levine
 International Conference on Robotics and Automation (ICRA), 2021.

[11] Parrot: Data-Driven Behavioral Priors for Reinforcement Learning A. Singh\*, H. Liu\*, G. Zhou, A. Yu, **N. Rhinehart**, S. Levine

Oral Presentation, International Conference on Learning Representations (ICLR), 2021.

[12] SMiRL: Surprise Minimizing RL in Dynamic Environments
G. Berseth, D. Geng, C. Devin, N. Rhinehart, C. Finn, D. Jayaraman, S. Levine
Oral Presentation, International Conference on Learning Representations (ICLR), 2021.

[13] Conservative Safety Critics for Exploration

H. Bharadhwaj, A. Kumar, **N. Rhinehart**, S. Levine, F. Shkurti, A. Garg International Conference on Learning Representations (ICLR), 2021.

[14] Inverting the Forecasting Pipeline with SPF2: Sequential Pointcloud Forecasting for Sequential Pose Forecasting X. Weng, J. Wang, S. Levine, K. Kitani, N. Rhinehart Conference on Robot Learning (CoRL), 2020.

[15] Can Autonomous Vehicles Identify, Recover From, and Adapt to Distribution Shifts? A. Filos\*, P. Tigas\*, R. McAllister, N. Rhinehart, S. Levine, Y. Gal International Conference of Machine Learning (ICML), 2020.

[16] Generative Hybrid Representations for Activity Forecasting with No-Regret Learning J. Guan, Y. Yuan, K. M. Kitani, N. Rhinehart Oral Presentation, Computer Vision and Pattern Recognition (CVPR), 2020.

[17] Deep Imitative Models for Flexible Inference, Planning, and Control N. Rhinehart, R. McAllister, S. Levine International Conference on Learning Representations (ICLR), 2020. [18] PRECOG: PREdiction Conditioned On Goals in Visual Multi-Agent Settings

N. Rhinehart, R. McAllister, K. M. Kitani, S. Levine

IEEE International Conference on Computer Vision (ICCV), 2019.

[19] Directed-Info GAIL: Learning Hierarchical Policies from Unsegmented Demonstrations using Directed Information

M. Sharma, A. Sharma, N. Rhinehart, K. M. Kitani

International Conference on Learning Representations (ICLR), 2019.

[20] First-Person Activity Forecasting from Video with Online Inverse Reinforcement Learning

N. Rhinehart, K. M. Kitani.

IEEE Transactions on Pattern Analysis and Machine Intelligence (TPAMI), 2018.

[21] R2P2: A ReparameteRized Pushforward Policy for Diverse, Precise Generative Path Forecasting

N. Rhinehart, K. M. Kitani, P. Vernaza

European Conference on Computer Vision (ECCV), 2018.

[22] Learning Neural Parsers with Deterministic Differentiable Imitation Learning

T. Shankar, N. Rhinehart, K. Muelling, K. M. Kitani

Conference on Robot Learning (CoRL), 2018.

[23] Human-Interactive Subgoal Supervision for Efficient Inverse Reinforcement Learning

X. Pan, E. Ohn-Bar, N. Rhinehart, Y. Xu, Y. Shen, K. M. Kitani

International Conference on Autonomous Agents and Multiagent Systems (AAMAS), 2018.

[24] N2N Learning: Network to Network Compression via Policy Gradient Reinforcement Learning

A. Ashok, N. Rhinehart, F. Beainy, K. M. Kitani

International Conference on Learning Representations (ICLR), 2018.

[25] Predictive-State Decoders: Encoding the Future into Recurrent Networks

A. Venkatraman\*, **N. Rhinehart**\*, W. Sun, L. Pinto, M. Hebert, B. Boots, K. M. Kitani, J. A. Bagnell Neural Information Processing Systems (**NeurIPS**), 2017.

[26] First-Person Activity Forecasting with Online Inverse Reinforcement Learning

N. Rhinehart, K. M. Kitani.

Oral Presentation, IEEE International Conference on Computer Vision (ICCV), 2017.

Best Paper Award Honorable Mention. Awarded to 3 of 2,143 submissions

[27] Learning Action Maps of Large Environments via First-Person Vision

N. Rhinehart, K. M. Kitani

Computer Vision and Pattern Recognition (CVPR), 2016.

[28] Visual Chunking: A List Prediction Framework for Region-Based Object Detection

N. Rhinehart, J. Zhou, M. Hebert, J. A. Bagnell

International Conference on Robotics and Automation (ICRA), 2015.

#### PRE-PRINTS

[29] Imitative Models for Passenger-Scale Autonomous Off-Road Driving

N. Dashora, S. Jung, V. Ibars, O. Lerner, C. Jung, D. Shah, **Nicholas Rhinehart**, R. Thakker, S. Levine, A. Agha-mohammadi In Submission, 2022.

[30] Explore and Control with Adversarial Surprise

A. Fickinger\*, N. Jaques\*, S. Parajuli, M. Chang, **N. Rhinehart**, G. Berseth, S. Russell, S. Levine arXiv, 2021.

#### **PATENTS**

- [31] Generative Adversarial Inverse Trajectory Optimization for Probabilistic Vehicle Forecasting P. Vernaza, W. Choi, N. Rhinehart US10739773B2, 2017.
- [32] Traffic prediction with reparameterized pushforward policy for autonomous vehicles P. Vernaza, N. Rhinehart US11189171B2, 2019.
- [33] Balancing diversity and precision of generative models with complementary density estimators P. Vernaza, N. Rhinehart, A. Liu, Kihyuk Sohn US11049265B2, 2019.

# Academic & Professional Presentations

# INVITED CONFERENCE AND WORKSHOP TALKS

NeurIPS 2022, Machine Learning for Autonomous Driving, New Orleans, LA, USA, Dec 2022

IROS 2022, Behavior-driven Autonomous Driving in Unstructured Environments, Kyoto, Japan [Remote], October 2022

ICRA 2021, Long-term Human Motion Prediction, Xi'an, China [Remote], Jun 2021

CVPR 2020, Precognition: Seeing through the Future, Seattle, Washington [Remote], Jun 2020

ICCV 2019, Workshop on Autonomous Driving - Beyond Single Frame Prediction, Seoul, South Korea, Oct 2019

ACCV 2018, Attention/Intention Understanding Workshop, Perth, Australia, Dec 2018

CVPR 2018, Tutorial on Inverse RL for Computer Vision, Organizer and Speaker, Salt Lake City, Utah, Jun 2018

CVPR 2018, Tutorial on Human Activity Forecasting, Salt Lake City, Utah, Jun 2018

#### CONTRIBUTED CONFERENCE AND WORKSHOP TALKS

ICLR 2021, Oral Paper Presentation of SMiRL (non-speaking), Vienna, Austria [Remote]	May 2021
ICLR 2021, Oral Paper Presentation PARROT (non-speaking), Vienna, Austria [Remote]	May 2021
CVPR 2020, Oral Paper Presentation (Last author, non-speaking), Seattle, Washington [Remote]	Jun 2020
Baylearn 2019, Single-Track Oral Paper Presentation, San Francisco, California	Oct 2019
NeurIPS 2018, Infer2Control: Probabilistic RL and Structured Control Workshop, Montreal, Canada	Dec 2018
NeurIPS 2018, ML for Intelligent Transportation Systems Workshop, Montreal, Canada	Dec 2018
ICCV 2017, Single-Track Oral Paper Presentation, Venice, Italy	Oct 2017
MACV 2016, Mid-Atlantic Computer Vision Workshop, Baltimore, Maryland	May 2016

#### INVITED UNIVERSITY TALKS

INVITED CHIVEROIT INERO	
The University of Toronto Robotics Institute, Toronto, Canada	June 2022
McGill University, Department of Electrical Engineering, Digital	March 2022
Stanford University, Stanford Vision and Learning Lab, Digital	Jan 2022
U.C. Berkeley, Berkeley Artificial Intelligence Research Lab Seminar, Berkeley, California	Jan 2022
Applied RL Seminar, Digital	Dec 2020
U.C. Berkeley, Berkeley Deep Drive Group, Berkeley, California	Aug 2018
U.C. Berkeley, RAIL Lab, Berkeley, California	Jun 2018
The University of Tokyo IIS, Sato Laboratory, Tokyo, Japan	Jun 2015
CMU, Misc-Read Vision Group, Pittsburgh, PA	Nov 2015

# Invited Industry Talks

Apple, Cupertino, California [Remote]	June 2022
Uber ATG. Toronto, Canada [Remote]	Oct 2020

Scale AI, San Francisco, California	Oct 2019
<b>Tesla</b> , Palo Alto, California	Oct 2019
Argo AI, Pittsburgh, Pennsylvania	Jul 2019
iSee, Pittsburgh, Pennsylvania	May 2019
Zoox, San Francisco, California	Jan 2019
Google Waymo, Mountain View, California	Nov 2018
NEC Labs America, Cupertino, California	Jun 2017
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ICCV 2019, Workshop on Autonomous Driving - Beyond Single Frame Prediction, Seoul, South Korea	Oct 2019
Guest Lectures	
CMU, Guest Lecture in Statistical Techniques of Robotics, Pittsburgh, Pennsylvania	May 2019
CMU, Guest Lecture in Deep RL and Control (10-703), Pittsburgh, Pennsylvania	Nov 2018
CMU, Introduction to Computer Vision, Guest Lecture, Pittsburgh, Pennsylvania	Apr 2018
CMU, Graduate Statistical Techniques in Robotics, Guest Lecture, Pittsburgh, Pennsylvania	Apr 2018
CMU, Graduate Statistical Techniques in Robotics, Guest Lecture, Pittsburgh, Pennsylvania	Sep 2017
Academic Activity & Service	
Research Mentoring	
Graduate students	
Charles Packer (UC Berkeley PhD student). Co-authored ICRA '21 paper, CoRL '22 submission.	2020-2022
Dhruv Shah (UC Berkeley PhD student). Co-authored ICRA '21, '22; CoRL '21 paper, '22 submission.	2020-2022
Panos Tigas (Oxford PhD student). Co-authored ICML '20 paper.	2019-2022
Xinshuo Weng (CMU RI PhD $\rightarrow$ NVIDIA research). Co-authored CoRL '20, ECCV '22, and NeurIPS '22 submission	2019-2022
Angelos Filos (Oxford PhD student). Co-authored ICML '20 paper.	2019-2020
Tanmay Shankar (CMU MS RI $\rightarrow$ FAIR). Co-authored CORL '18 paper.	2018
Arjun Sharma (CMU MS RI $ ightarrow$ Vicarious). Co-authored ICLR '19 paper.	2018
Mohit Sharma (CMU MS RI $\rightarrow$ PhD at CMU). Co-authored ICLR '19 paper.	2018
Anubhav Ashok (CMU MS CV $ ightarrow$ Niantic). Co-authored ICLR '18 paper.	2017
Xinlei Pan (UC Berkeley PhD $ ightarrow$ Waymo). Co-authored AAMAS '18 paper.	2017
Undergraduate students	
Hrish Leen (UC Berkeley). Co-authored CoRL '22 submission with Hrish.	2022-2022
Arjun Bhorkar (UC Berkeley). Co-authored CoRL '22 submission with Arjun.	2022-2022
Nitish Dashora (UC Berkeley). Co-authored ICRA '22 paper with Nitish.	2021-2022
Daniel Shin (UC Berkeley). Co-authored ICRA '22 paper with Daniel.	2021
Jenny Wang (UC Berkeley $ ightarrow$ CMU PhD). Co-authored NeurIPS '21 paper with Jenny.	2020-2022
Jeff He (UC Berkeley $\rightarrow$ MS at Stanford). Co-authored ICRA '21 paper with Jeff.	2020-2021
Huihan Liu (UC Berkeley $ ightarrow$ PhD at UT Austin). Co-authored ICLR '21 paper with Huihan.	2020 - 2021
Jiaqi Guan (Tsinghua University $ ightarrow$ PhD at UIUC). Last-authored CVPR '20 paper (Oral) with Jiaqi.	2018 - 2019
Teaching	
Teaching Assistance	
Geometry-based Methods in Vision (16-822), CMU.	Fall 2016
Data Structures and Algorithms (CPSC 035), Swarthmore College.	Fall 2011
Data Structures and Algorithms (CPSC 035), Swarthmore College.	Spring 2011
Introduction to Computer Science (CPSC 021), Swarthmore College.	Spring 2010
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Tutoring	
Fundamentals of Digital Systems (ENGR 015, CS 038), Swarthmore College	Fall 2011
Grade 6–12 Mathematics and Physics	Spring 2009 – Spring 2012
Professional Service	
Organizer	
ICRA '22 Workshop on Fresh Perspectives on the Future of Autonomous Driving	2022
NeurIPS '21 Workshop on Machine Learning for Autonomous Driving	2021
NeurIPS '20 Workshop on Machine Learning for Autonomous Driving	2020
NeurIPS '19 Workshop on Machine Learning for Autonomous Driving	2019
ICML '19 Workshop on Imitation, Intent, and Interaction (I3)	2019
CVPR '18 Tutorial on Inverse RL for Computer Vision [recording has >5,000 views]	2018
Area Chair	
NeurIPS '24	2024
NeurIPS '23	2023
Conference and Journal Reviewing	
CoRL '22, CVPR '22, ICML '22, NeurIPS '22, NeurIPS '22 workshop proposals, TMLR '22	2022
CoRL '21, CVPR '21, ICCV '21, ICLR '21, ICML '21, ICRA '21, NeurIPS '21, RA-L '21	2021
CoRL '20, ICLR '20, ICML '20, ICRA '20, ECCV '20, HRI '20, JAIR '20, NeurIPS '20, TPAMI '20	2020
BMVC '19, CVPR '19, ICML '19, ICCV '19, ICRA '19, NeurIPS '19, TPAMI '19, IJCV '19	2019
CVPR '18, ECCV '18, IJCV '18, IJRR '18, IROS '18	2018
CVPR '17, ICCV '17	2017
CVPR '16	2016
Workshop Reviewing	
Omitted for concision. Available upon request.	
University Service	
BAIR Undergraduate Mentoring, UC Berkeley	2020
Mentored undergraduates from underrepresented groups to foster participation in AI research	2020
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Ph.D. Admissions Committee, CMU Robotics Institute	2017
Evaluated Ph.D. applications as part of small committee	
M.S. Admissions Committee, CMU Robotics Institute	2015, 2016
Evaluated M.S. applications as part of small committee	2010, 2010
Robotics Institute Representative, CMU Graduate Student Association	2015 - 2017
Represented and liaised between Robotics graduate students and the Graduate Student Assembly	
Co-Chair, Swarthmore Philanthropy Council	2011 - 2012
Assist in coordinating alumni fundraising efforts	
Class Treasurer, Swarthmore College	2011 – Present
Manage the collective finances of the Class of 2012	
Thesis Committees	
M.S. Robotics, CMU	
Tanmay Shankar, Learning Neural Parsers with Deterministic Differentiable Imitation Learning	2018
Arjun Sharma, Integrating Structure with Deep Reinforcement and Imitation Learning	2018
Mohit Sharma, Inverse Reinforcement Learning with Conditional Choice Probabilities	2018
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