## **David Held**

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Current	Assistant Professor, Robotics Institute, Carnegie Mellon University	2017 - Present
appointment		

**Education** Stanford University

2012 - 2016

Ph.D. in Computer Science.

Thesis: Deep Learning and Probabilistic Methods for Robotic Perception from Streaming Data Advised by Sebastian Thrun and Silvio Savarese.

Stanford University 2010 - 2012

Masters of Science in Computer Science.

Thesis: Autonomous Driving: Car Detection, Tracking, and Street Sign Detection

Advised by Sebastian Thrun and Vaughan Pratt.

Massachusetts Institute of Technology 2006 - 2007

Masters of Science in Mechanical Engineering.

Massachusetts Institute of Technology 2001 - 2005

Bachelor of Science in Mechanical Engineering with a concentration in Controls Engineering.

## **Publications**

Ancha, S., Pathak, G., Narasimhan, S., **Held, D.**, Active Safety Envelopes using Light Curtains with Probabilistic Guarantees, Robotics: Science and Systems (RSS), 2021

Okorn, B.\*, Gu, Q.\*, Hebert, M., **Held, D.**, ZePHyR: Zero-shot Pose Hypothesis Rating, International Conference of Robotics and Automation (ICRA), 2021

Raaj, Y., Ancha, S., Tamburo, R., **Held, D.**, Narasimhan, S., Exploiting & Refining Depth Distributions with Triangulation Light Curtains, Conference on Computer Vision and Pattern Recognition (CVPR), 2021

Hu, P., Huang, A., Dolan, J., **Held, D.**, Ramanan, D., Safe Local Motion Planning with Self-Supervised Freespace Forecasting, Conference on Computer Vision and Pattern Recognition (CVPR), 2021

Lin, X., Wang, Y., Okin, J., **Held, D.**, SoftGym: Benchmarking Deep Reinforcement Learning for Deformable Object Manipulation, Conference on Robot Learning (CoRL), 2020

Wang, Y., Narasimhan, G., Lin, X., Okorn, B., **Held, D**., Visual Self-Supervised Reinforcement Learning with Object Reasoning, Conference on Robot Learning (CoRL), 2020

Zhou, W., Bajracharya, S., **Held, D**.; PLAS: Latent Action Space for Offline Reinforcement Learning; Conference on Robot Learning (CoRL), 2020 - **Plenary talk** (Selection rate 4.1%)

Ancha, S., Raaj, Y., Hu, P., Narasimhan, S., **Held, D.**, Active 3D Perception using Light Curtains, European Conference on Computer Vision (ECCV), 2020 - **Spotlight** (Selection rate 5.3%)

Qian\*, J., Weng\*, T., Zhang, L., Okorn, B., **Held, D.**; Cloth Region Segmentation for Robust Grasp Selection; International Conference on Intelligent Robots and Systems (IROS), 2020

Wang, J., Ancha, S., Chen, Y., **Held, D.**, Self-supervised Learning for 3D Data Association; International Conference on Intelligent Robots and Systems (IROS), 2020

Okorn, B., Xu, M., Hebert, M., **Held, D.**, Learning Orientation Distributions for Object Pose Estimation, International Conference on Intelligent Robots and Systems (IROS), 2020

Weng, X., Wang, J., **Held, D**., Kitani, K., 3D Multi-Object Tracking: A Baseline and New Evaluation Metrics; International Conference on Intelligent Robots and Systems (IROS), 2020

- Mittal, H., Okorn, B., **Held. D.**, <u>Just Go with the Flow: Self-Supervised Scene Flow Estimation</u>. Conference on Computer Vision and Pattern Recognition (CVPR), 2020 Oral (Selection rate 5.7%)
- Hu, P., Ziglar, J., **Held, D.**, Ramanan, D. <u>What You See is What You Get: Exploiting Visibility for 3D Object Detection</u>. Conference on Computer Vision and Pattern Recognition (CVPR), 2020 Oral (Selection rate 5.7%)
- Weng, T., Pallankize, A., Tang, Y., Kroemer, O., **Held, D.** <u>Multi-modal Transfer Learning for Grasping Transparent and Specular Objects</u>. Robotics and Automation Letters (RA-L) with presentation at the International Conference of Robotics and Automation (ICRA), 2020
- Hu, P., **Held, D.**, Ramanan, D. <u>Learning to Optimally Segment Point Clouds</u>. Robotics and Automation Letters (RA-L) with presentation at the International Conference of Robotics and Automation (ICRA), 2020
- Ancha, S., Lin, J., **Held, D.** Combining Deep Learning and Verification for Precise Object Instance Detection. Conference on Robot Learning (CoRL), 2019
- Lin, X., Baweja, H., Kantor, G., **Held, D.**, <u>Adaptive Auxiliary Task Weighting for Reinforcement</u> Learning, Neural Information Processing Systems (NeurIPS), 2019
- Lin, X., Guo, P., Florensa, C., **Held, D.**, <u>Adaptive Variance for Changing Sparse-Reward Environments</u>, *International Conference of Robotics and Automation (ICRA)*, 2019
- Yuan, W., Khot, T., **Held, D.**, Mertz, C., Hebert, M., <u>PCN: Point Completion Network</u>, *International Conference on 3D Vision (3DV)*, 2018 **Best Paper Honorable Mention**
- Florensa, C., **Held, D.,** Geng, X., Abbeel, P., <u>Automatic Goal Generation for Reinforcement Learning Agents</u>, *International Conference on Machine Learning (ICML)*, 2018
- Huang, S., **Held, D.,** Abbeel, P., Dragan, A. <u>Enabling Robots to Communicate their Objectives</u>, *Autonomous Robotics (AURO)*, 2018
- Florensa, C., **Held, D.**, Wulfmeier, M. and Abbeel, P., <u>Reverse Curriculum Generation for Reinforcement Learning</u>, *Conference on Robot Learning* (*CoRL*), 2017.
- Clavera, I., **Held, D.**, Abbeel, P., <u>Policy Transfer via Modularity</u>, *International Conference on Intelligent Robots and Systems (IROS)*, 2017.
- Achiam, J., **Held, D.**, Tamar, A. and Abbeel, P., <u>Constrained Policy Optimization</u>. *International Conference on Machine Learning (ICML)*, 2017.
- Huang, S. H., **Held, D.**, Abbeel, P., & Dragan, A. D. <u>Enabling Robots to Communicate their Objectives</u>. *Robotics: Science and Systems (RSS)*, 2017.
- **Held, D.,** McCarthy, Z., Zhang, M., Shentu, F., Abbeel, P., <u>Probabilistically Safe Policy Transfer.</u> *International Conference of Robotics and Automation (ICRA)*, 2017.
- **Held, D.**, Thrun, S., Savarese, S., <u>Learning to Track at 100 FPS with Deep Regression Networks.</u> *European Conference on Computer Vision (ECCV), 2016.*
- **Held, D.,** Guillory, D., Rebsamen, B., Thrun, S., Savarese, S., <u>A Probabilistic Framework for Real-time</u> <u>3D Segmentation using Spatial, Temporal, and Semantic Cues.</u> *Robotics: Science and Systems (RSS),* 2016.
- Held, D., Thrun, S., Savarese, S. <u>Robust Single-View Instance Recognition</u>. *International Conference of Robotics and Automation (ICRA)*, 2016.
- Held, D., Levinson, J., Thrun, S., Savarese, S. Robust Real-Time Tracking Combining 3D Shape, Color, and Motion. *International Journal of Robotics Research (IJRR)*, 2016.
- **Held, D.**, Levinson, J., Thrun, S., Savarese, S. <u>Combining 3D Shape, Color, and Motion for Robust Anytime Tracking.</u> *Robotics: Science and Systems (RSS), 2014.*

**Held, D.**, Levinson, J., Thrun, S. <u>Precision Tracking with Sparse 3D and Dense Color 2D Data</u> *International Conference of Robotics and Automation (ICRA), 2013.* - Best Vision Paper Finalist

**Held, D.**, Levinson, J., Thrun, S. <u>A Probabilistic Framework for Car Detection in Images using Context and Scale</u>. *International Conference of Robotics and Automation (ICRA)*, 2012.

**Held, D.**, Yekutieli, Y., Flash, T. <u>Characterizing Stiffness of Multi-Segment Flexible Arm Movements.</u> *International Conference of Robotics and Automation (ICRA), 2012.* 

Levinson, J.; Askeland, J.; Becker, J.; Dolson, J.; **Held, D.**; Kammel, S.; Kolter, J.Z.; Langer, D.; Pink, O.; Pratt, V.; Sokolsky, M.; Stanek, G.; Stavens, D.; Teichman, A.; Werling, M.; Thrun, S. (2011) <u>Towards Fully Autonomous Driving: Systems and Algorithms.</u> Intelligent Vehicles Symposium (IV), IEEE, June 2011.

Jones, L.A., **Held, D.** & Hunter, I. <u>Surface Waves and Spatial Localization in Vibrotactile Displays.</u> Proceedings of the IEEE Haptics Symposium, 2010.

Jones, L.A. & **Held, D.** <u>Characterization of Tactors Used in Vibrotactile Displays.</u> Journal of Computing and Information Sciences in Engineering, 2008.

Jin, Z., Waydo, S., Wildanger, E.B., Lammers, M., Scholze, H., Foley, P., **Held, D.**, Murray, R.M. <u>MVWT-II: The Second Generation Caltech Multi-Vehicle Wireless Testbed.</u> 2004 American Control Conference (ACC), 2004.

# Research and Industry Experience

### U.C. Berkeley Robot Learning Lab

2016 - 2017

Post-doctoral researcher. Developed deep reinforcement learning algorithms for object manipulation

## **Stanford Autonomous Driving Team**

2010 - 2016

Ph.D. Student. Developed perception algorithms for self-driving car.

#### Google [x] Self-driving Car Team

2013

Intern. Developed perception algorithms for Google's self-driving car.

## Weizmann Laboratory for Vision Research and Robotics

2009 - 2010

Research Assistant. Developed novel method to analyze stiffness of simulated octopus arm.

Evolven Software 2008-2009

Software developer. Developed enterprise software for configuration management.

#### **MIT Bioinstrumentation Lab**

2006 - 2007

Master's Thesis. Modeled the interaction of tactors with skin for a vibrotactile display.

### **Harvard Social Psychology Lab**

2005

Research Assistant. Tested the contrast effect with images.

## **MIT Aerospace Controls Lab**

2004

Research Assistant. Analyzed digital magnetometer signals for controlling a UAV.

#### **Caltech Controls and Dynamical Systems**

2003

Research Assistant. Designed an outdoor testbed of 12 miniature hovercrafts.

#### **Patents**

Robust Anytime Tracking Combining 3D Shape, Color, and Motion with Annealed Dynamic Histograms (Provisional Patent: 14/733,902)

#### **Awards**

NSF CAREER Award 2021

Google Research Faculty Award 2017 Best Vision Paper Finalist, ICRA 2013

Best Master's Thesis of 2012 in Stanford's Computer Science Department

Invited Talks	RSS Workshop: Deform	nable Object Simulation in Robotics	2021		
	CVPR Workshop: 3D D	Deep Learning and Robotics	2021		
	Naver Labs Europe		2021		
	Technion Robotics Sem	inar	2021		
		otion and Modeling for Manipulation of Objects	2021		
		idual Vehicle Autonomy: Perception and Control	2020 2019		
	Aachen University, Aachen, Germany,				
	CVPR Workshop: Bring	ging Robots to the Computer Vision Community	2019		
	Deep Learning Summit	, Boston, MA,	2019		
	Brown University, Prov	vidence, RI,	2018		
	UT Austin		2018		
	Symposium on Machin	e Learning in Science and Engineering	2018		
	Carnegie Mellon Unive	rsity, RoboOrg Meta-Seminar	2017		
		rsity, Robotics Institute Seminar	2017		
	Cornell University		2017		
	Carnegie Mellon Unive		2017		
	University of British Co		2017		
	Microsoft Research, Ca		2017		
	Hebrew University (Isra	101)	2017 2017		
	University of Michigan Tel Aviv University (Isr	(190	2017		
	Princeton University	acij	2017		
	Massachusetts Institute	of Technology	2017		
	University of California		2017		
	University of Southern		2017		
	Toyota Technology Inst		2017		
	University of California, San Diego				
	Northeastern University				
	Columbia University				
	Weizmann Institute (Israel)				
	University of Cambridge				
	Spotlight Talk at NeurIPS Workshop on Reliable Machine Learning in the Wild				
	Future Star Talks Series at RSS Workshop on Deep Learning for Autonomous Robots Northeastern College of Computer and Information Science Seminar				
	Northeastern College of Computer and Information Science Seminar Harvard School of Engineering and Applied Sciences Special Seminar				
	Johns Hopkins Laboratory for Computational Sensing and Robotics Seminar				
	University of Maryland Computer Vision Laboratory Seminar				
	TTI Chicago Young Researcher Seminar Series				
	MIT Robotics Seminar				
	UC Berkeley		2015 2015		
		rsity VASC Seminar Talk	2015		
	University of Toronto AI Seminar				
	University of Michigan AI Seminar				
	The Future of Driverless Car Technology, UCLA VC Fund				
	Google [x] Self-driving Car Team				
	Stanford-Seoul Nationa	l University Workshop on Automated Driving	2015		
<b>Teaching</b>	Statistical Techniques in Robotics (16-831) - 2018-2021				
	Special Seminar: Deep Reinforcement Learning for Robotics (16-881) - 2019-2021 Graduate Computer Vision (16-720-A), co-taught with Srinivasa Narasimhan - 2017				
	Graduate Computer Vis	ion (10-720-74), co-taught with Shinivasa ivarasininan - 2017			
Mentoring	Current PhD students:	Brian Okorn (co-advised with Martial Hebert)			
		Xingyu Lin Siddarth Ancha (co-advised with Srinivasa Narasimhan)			
		Thomas Weng			
		Wenxuan Zhou			
		Benjamin Eisner			
		<b>,</b>			
	Current MS students:	Harshit Sikchi			

Qiao Gu

Gaurav Pathak Zixuan Huang Chuer Pan Past MS students: Sujay Bajracharya

Jianing (Aurora) Qian

Gautham Narayan Narasimhan

Yufei Wang Jenny Nan

Mengyun (Olivia) Xu

Edward Ahn Harjatin Baweja Pengsheng Guo Tiancheng Jin Ignasi Clavera Devin Guillory

Past undergraduate researchers:

M. Nomaan Qureshi Rahul Chakwate Kai Zhang Patrick Liu Jake Olkin Yifan Qiao Michael Zhang Fred Shentu Xinyang Geng Helen Jiang Derin Dutz Naor Brown Jacquelyn Kunkel Elizabeth Kim Katherine Ray

Past MRSD teams: Cubi: Jorge Anton, Nithin Subbiah Meganathan, Laavanye Bahl,

Changsheng Shen, Paulo Camasmie

Beyond Sight: Chien Chih Ho, Pengsheng Guo, Rohit Murthy, Vivek Gopal

Ramaswamy, and Oliver Krengel

**Service** Associate Editor: RA-L 2020-2021

IROS 2018-2021 ICRA 2017-2021 ICRA Workshops 2021 ICML 2019-2020 NeurIPS 2019-2020

Co-organizer: RSS Workshop - Workshop on Visual Learning and Reasoning for Robotics,

2020-2021

NeurIPS Workshop - Deep Learning for Action and Interaction, 2016

ICRA Publications co-Chair (unofficial), 2016

Stanford AI Lab Distinguished Speaker Series 2014-2015

Bay Area Vision Meeting 2014

ONR Workshop on Structured Learning for Scene Understanding 2014

Reviewer: Black in AI Innovation and Research Summer Research Grant, 2021

CoRL 2019-2021

RSS 2016-2018, 2020-2021 ICRA Workshops 2021 RSS Pioneers 2018-2020

NeurIPS Workshop - Black in AI 2018-2020

RA-L 2019-2020

ICRA 2014-2016, 2018-2019 Journal of Field Robotics, 2019

ICML Workshop - Multi-Task and Lifelong Reinforcement Learning, 2019 CVPR Workshop - Real-World Challenges and New Benchmarks for Deep

Learning in Robotic Vision 2018

CoRL 2017-2018

CVPR VOCVALC - 2nd International workshop on Visual Odometry and Computer Vision Applications based Location Clues 2018

TPAMI 2017-2018 IROS 2013-2016

NeurIPS Workshop - Acting and Interacting in the Real World: Challenges in Robot Learning, 2017

NeurIPS Workshop - Hierarchical Reinforcement Learning, 2017 CVPR Workshop - Deep Learning for Robotic Vision 2015, 2017

IETE Journal of Research 2016

T-RO 2015 CVPR 2015

CVPR Workshop - Computer Vision in Vehicle Technology, 2015

ITS 2011-2014

Other: AI4All Summer Program, 2018-2019, 2021

AI Mentor-Matching Program, 2017-2021

NSF Panel - 2019-2021

**Training programs:** Mental Health First Aid Certification

**Bias Busters** 

Floor Marshal Training Active Shooter Training Green Dot Overview Training

Social Host Training

Media "New deep learning algorithms could improve robot sight," Tech Target, 2018

**Coverage** "How computers with humanlike senses will change our lives," Wall Street

Journal