

Zachary Nolan Sunberg

Electrical Engineering and Computer Science Department, University of California
Cory Hall, 2626 Hearst Ave, Berkeley, CA 94720

720-933-7799 • sunbergzach@gmail.com • zachary.sunberg.net

Education

- Postdoctoral Research Scholar** [October 2018 – Present]
University of California, Berkeley, CA
Supervisor: Claire Tomlin, Hybrid Systems Laboratory
- Doctor of Philosophy in Aeronautics and Astronautics** [2018]
Stanford University, Stanford, CA
Advisor: Mykel Kochenderfer | Thesis: "Safety and Efficiency in Autonomous Vehicles through Planning with Uncertainty"
- Master of Science in Aerospace Engineering** [2013]
Texas A&M University, College Station, TX
Advisor: Jonathan Rogers | Thesis: "A Real Time Expert Control System for Helicopter Autorotation"
- Bachelor of Science in Aerospace Engineering** [2011]
Texas A&M University, College Station, TX
Summa cum Laude, Minor in Mathematics

Research

- Hybrid Systems Laboratory** [October 2018 – Present]
University of California, Berkeley, CA
- Safety verification of control systems with visual sensors (DARPA Assured Autonomy):** Developing techniques for guaranteeing the safety of a vehicle that uses a camera as a sensor, possibly with a convolutional-neural-network processing step. We hope to overcome some of the challenges of incorporating the visual sensor through careful design of the control and information filtering systems.
- Advanced algorithms for continuous POMDPs:** Developing algorithms based on DESPOT for problems with continuous observation spaces to overcome the shortcomings of POMCPOW (see below, [7]) including a tendency to create shallow search trees and challenges with theoretical guarantees.
- Reachability-based safety constraints in partially observable domains:** Combining Hamilton-Jacobi reachability analysis with partial observability, focused on problems with human interaction; using POMDP planners to find optimized feedback policies that are aware of the reachability-based safety constraints.
- Stanford Intelligent Systems Laboratory (SISL)** [2015 – 2018]
Stanford University, Stanford, CA
- POMCPOW:** Proved analytically that leading online POMDP solvers converge to suboptimal solutions for problems with continuous observation spaces and proposed a new algorithm, partially observable Monte Carlo planning with observation widening (POMCPOW) as a solution [7].
- Behavior-aware decision making in self-driving cars:** Showed that modeling the internal states of other human drivers and approximately solving the resulting POMDP can simultaneously improve both safety and efficiency. In particular, a multiple-lane-change maneuver on a highway can be accomplished in about half the time while still maintaining the same levels of safety and comfort [8]. Other students are currently collaborating with me to .
- Adaptive control with belief space MCTS:** Solved adaptive control problems (i.e. problems where some dynamics parameters are unknown) by modeling them as POMDPs and using Monte Carlo tree search (MCTS) in the belief space. This approach achieved superior results compared to a conventional approach in cases with large uncertainty [9, 15].

Autonomous Systems Laboratory (ASL) [2014 – 2016]
Stanford University, Stanford, CA

UAV collision avoidance: Developed a method to dynamically optimize the performance a trusted collision avoidance system without sacrificing certifiability [10].

Hansen Experimental Physics Lab [2013 – 2014]
Stanford University, Stanford, CA

Geostationary LISA: Investigated gravitational coupling between a drag free test mass and a communications satellite carrying it for a laser interferometer gravity wave experiment.

Helicopters and Unmanned Systems Laboratory (HUSL) [2011 – 2013]
Texas A&M University, College Station, TX

Autonomus autorotation: Created a control system for autonomous autorotation of manned and unmanned helicopters, and successfully flight tested it on a small RC helicopter [3]. Currently advising a team at the Air Force Research Lab on an autorotation-based delivery system.

Distance metrics for Dempster Shafer theory: Developed a distance metric for Dempster-Shafer theory that applies to orderable and continuous sets like those encountered in the real world [5].

Air Force Research Lab Summer Faculty Program (Research Assistant) [Summer 2011]
Kirtland AFB, Albuquerque, NM

Space situational awareness: Developed an online algorithm for managing uncertainty about orbital vehicles and debris with a network of sensors [2].

Teaching

Army High Performance Computing Summer Institute [June 2017]
Stanford University, Stanford, CA

Developed and taught a 5 lecture course about decision making under uncertainty for college students.

Stanford Artificial Intelligence Lab Outreach Summer (SAILORS, now AI4ALL) [2015-2017]
Stanford University, Stanford, CA

Developed and taught a 2 week course and project for high school students that included programming robots for optical line following and using Dijkstra's algorithm to find the shortest path on a road network; only project mentor to serve all three years of the program. <http://ai-4-all.org/>

AA-228/CS-238 Decision Making Under Uncertainty [Autumn 2016]
Stanford University, Stanford, CA

Head course assistant for a class of around 200; developed problems for midterm project; gave guest lectures on the POMDPs.jl framework and autonomous driving research; project software was reused in a course at Iowa State University.

Talks

Invited Industry Talks [2018]

Renault-Nissan Research, Sunnyvale, CA: Safety and Efficiency in Autonomous Vehicles through POMDP Planning

Lyft Level 5, Palo Alto, CA: Safety and Efficiency in Autonomous Vehicles through Planning with Uncertainty

Makani (Google X), Alameda, CA: Algorithms for Uncertain, Non-convex Control Problems in the Real World

Indeed, San Francisco, CA: Safety and Efficiency in Autonomous Vehicles through Planning with Uncertainty

Julia in Controls Workshop [May 2017]

American Control Conference, Seattle, WA

Taught a tutorial of the POMDPs.jl software package at a workshop at the American Control Conference.

POMDPs.jl - Challenges and Lessons Learned [March 2017]

Open Source Software for Decision Making (OSS4DM), Stanford, CA

Presented and discussed the challenges that we faced and lessons that we learned in creating POMDPs.jl.

Industry Experience

Google, Inc., Mountain View, CA [Summer 2014]
Software Engineering Intern

Wrote software to evaluate and optimize a NASA collision avoidance program for use with Google self-piloted air vehicles.

Lockheed Martin Autonomous Systems, Littleton, CO [Summer 2009]
Intern

Helped in testing of autonomous SMSS allterrain military transport vehicle navigation system; wrote rough terrain navigation program in C++ based on the A* search algorithm; wrote software in C++ for analyzing the performance of an advanced video analysis tool.

Fellowships and Awards

National Science Foundation Graduate Research Fellowship [2012-2016]

Association for the Advancement of Artificial Intelligence Doctoral Consortium [February 2018]

American Control Conference Student Travel Award [May 2017]

Open Source Software

POMDPs.jl [2015 – present]

<https://github.com/JuliaPOMDP/POMDPs.jl>

Interface for defining continuous and discrete, fully and partially observable Markov decision processes along with a suite of state-of-the-art solvers written in Julia and C++.

Review Experience

I have reviewed submissions for the following journals and conferences:

Journal of Artificial Intelligence Research

IEEE Transactions on Cybernetics

Journal of Aerospace Information Systems

International Symposium on Robotics Research

American Control Conference

International Conference on Robotics and Automation

Peer Reviewed Journal Publications

- [1] Maxim Egorov, Zachary N. Sunberg, Edward Balaban, Tim A. Wheeler, Jayesh K. Gupta, and Mykel J. Kochenderfer. "POMDPs.jl: A Framework for Sequential Decision Making under Uncertainty". In: *Journal of Machine Learning Research* 18.26 (2017). URL: [↗](#).
- [2] Zachary Sunberg, Suman Chakravorty, and Richard Scott Erwin. "Information Space Receding Horizon Control for Multisensor Tasking Problems". In: *IEEE Transactions on Cybernetics* 46.6 (2016). URL: [↗](#).
- [3] Zachary N. Sunberg, Nathaniel R. Miller, and Jonathan D. Rogers. "A Real-Time Expert Control System For Helicopter Autorotation". In: *Journal of the American Helicopter Society* 60.2 (2015). DOI: 10.4050/JAHS.60.022008. URL: [↗](#).
- [4] Zachary Sunberg, Suman Chakravorty, and Richard Scott Erwin. "Information Space Receding Horizon Control". In: *IEEE Transactions on Cybernetics* 43.6 (2013). URL: [↗](#).
- [5] Zachary Sunberg and Jonathan Rogers. "A Belief Function Distance Metric for Orderable Sets". In: *Information Fusion* 14.4 (2013). DOI: 10.1016/J.INFFUS.2013.03.003. URL: [↗](#).

Peer Reviewed Conference Publications

- [6] Ekhlās Sonu, Zachary Sunberg, and Mykel J. Kochenderfer. "Exploiting Hierarchy for Scalable Decision Making in Autonomous Driving". In: *Intelligent Vehicles Symposium*. 2018.

- [7] Zachary N. Sunberg and Mykel J. Kochenderfer. "Online Algorithms for POMDPs with Continuous State, Action, and Observation Spaces". In: *International Conference on Automated Planning and Scheduling (ICAPS)*. 2018. URL: [↗](#).
- [8] Zachary N. Sunberg, Christopher J. Ho, and Mykel J. Kochenderfer. "The Value of Inferring the Internal State of Traffic Participants for Autonomous Freeway Driving". In: *American Control Conference (ACC)*. 2017. URL: [↗](#).
- [9] Patrick Slade, Preston Culbertson, Zachary Sunberg, and Mykel J. Kochenderfer. "Simultaneous Active Parameter Estimation and Control using Sampling-based Bayesian Reinforcement Learning". In: *IEEE/RSJ International Conference on Intelligent Robots and Systems (IROS)*. 2017. URL: [↗](#).
- [10] Zachary Sunberg, Mykel J. Kochenderfer, and Marco Pavone. "Optimized and Trusted Collision Avoidance for Unmanned Aerial Vehicles using Approximate Dynamic Programming". In: *IEEE International Conference on Robotics and Automation (ICRA)*. 2016. URL: [↗](#).
- [11] Zachary Sunberg, Suman Chakravorty, and Richard Erwin. "Information space sensor tasking for Space Situational Awareness". In: *American Control Conference (ACC)*. June 2014. doi: 10.1109/ACC.2014.6858922.
- [12] Zachary Sunberg, Nathaniel Miller, and Jonathan Rogers. "A Real Time Expert Control System for Helicopter Autorotation". In: *70th Forum of the American Helicopter Society*. 2014.
- [13] Zachary Sunberg and Jonathan Rogers. "A Fuzzy Logic-Based Controller for Helicopter Autorotation". In: *AIAA Aerospace Sciences Meeting*. 2013.
- [14] Zachary Sunberg, Suman Chakravorty, and Richard Erwin. "Information Space Receding Horizon Control for MultiAgent Systems". In: *American Control Conference (ACC)*. 2012. URL: [↗](#).

Forthcoming Publications

- [15] Patrick Slade, Zachary Sunberg, and Mykel J. Kochenderfer. "Estimation and Control Using Sampling-Based Bayesian Reinforcement Learning". Under review; submitted to *IEEE Transactions on Systems, Man, and Cybernetics: Systems*.