

# SYNDROME: SYNergetic DROne Delivery Network in MEtropolis

Naira Hovakimyan<sup>†</sup>, Lavanya Marla<sup>†</sup>, Marco Pavone<sup>‡</sup>, Srinivasa Salapaka<sup>†</sup>, Ranxiao Wang<sup>†</sup>, and Xiaofeng Wang<sup>§</sup>

<sup>†</sup>University of Illinois at Urbana-Champaign, <sup>‡</sup>Stanford University, <sup>§</sup>University of South Carolina



## Motivation

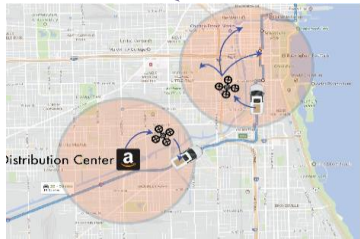
The rapid growth of e-commerce demands has resulted in increased traffic of delivery trucks while **slowing down the pace** of delivery operations



Dispatch a package over the delivery network

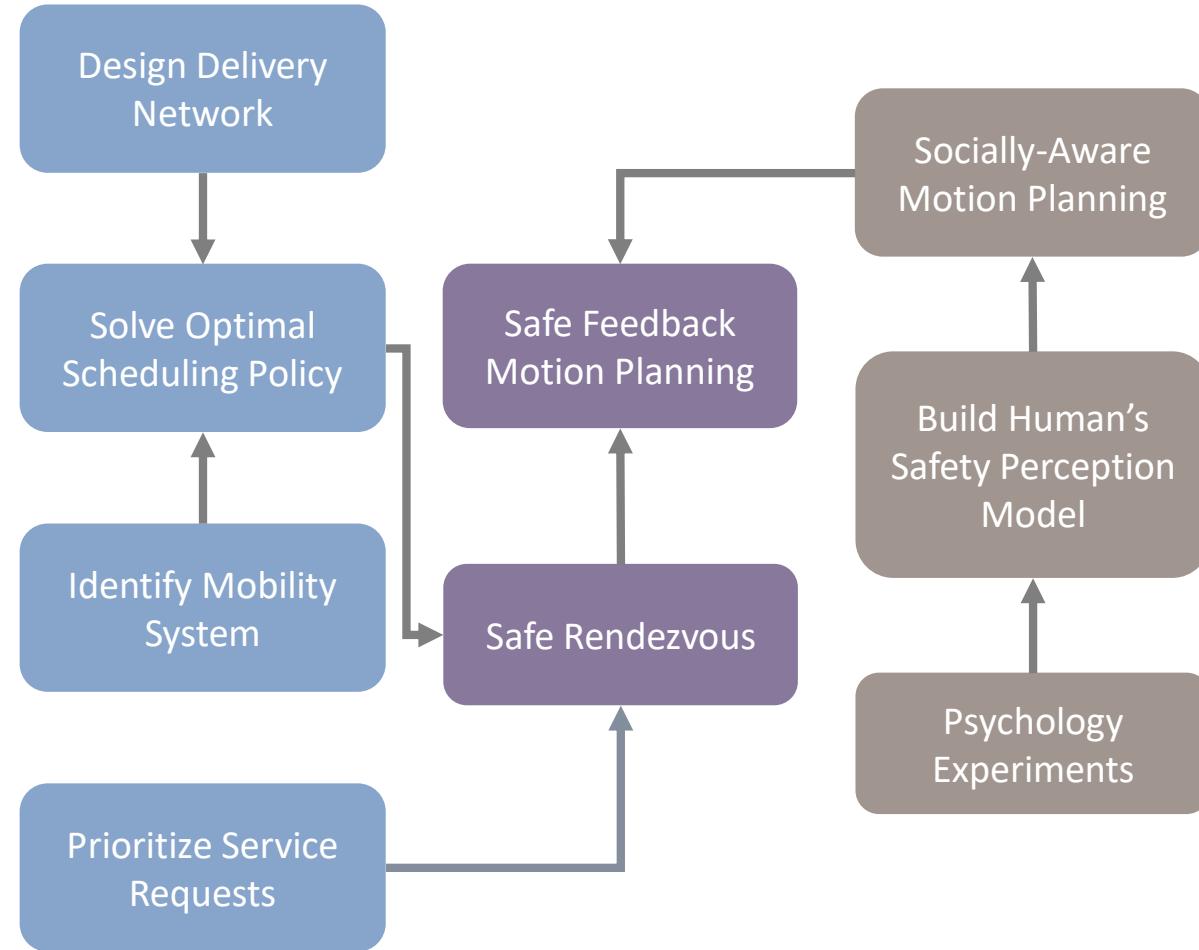
Use space on a ground vehicle's roof

Fly last-mile to the target position



The proposed delivery network is comprised of **autonomous flying robots** and **existing transport networks** (public and private ground vehicles).

## Technical Approach



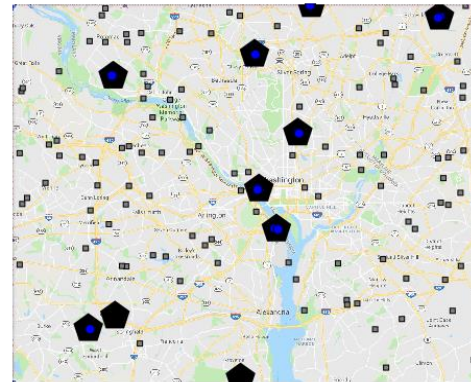
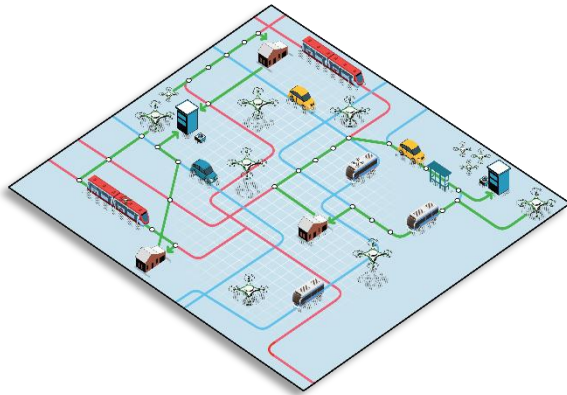
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## Large-Scale Drone Delivery Network

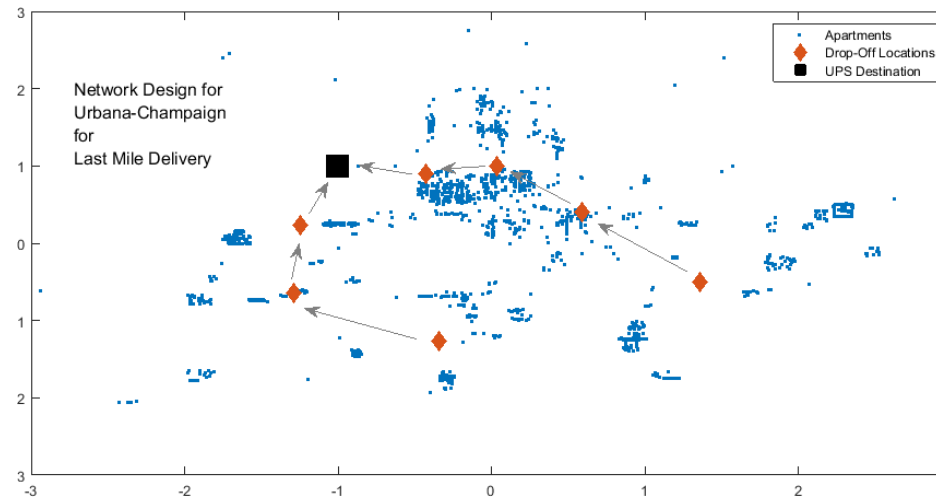


An efficient and scalable framework for multi-drone delivery while utilizing public transit network over large urban areas.

- Assigns drone routes to deliver packages while **avoiding conflicts between drones**;
- Strives to minimize the overall delivery time of all the packages in the system.

S. Choudhury, K. Solovey, M. Kochenderfer and M. Pavone, "Efficient Large-Scale Multi-Drone Delivery Using Transit Networks." ICRA 2020: 4543-4550.

## Optimized Facility and Path Optimization



A framework for simultaneously solving Facility Location and Path Optimization

- Considers both static and dynamic spatial networks;
- A novel stage-wise viewpoint of the paths to design the decision variable space;
- Optimization via **Maximum Entropy Principle**.

Srivastava, Amber, and Srinivasa M. Salapaka. "Simultaneous Facility Location and Path Optimization in Static and Dynamic Networks." IEEE Transactions on Control of Network Systems 7.4 (2020): 1700-1711

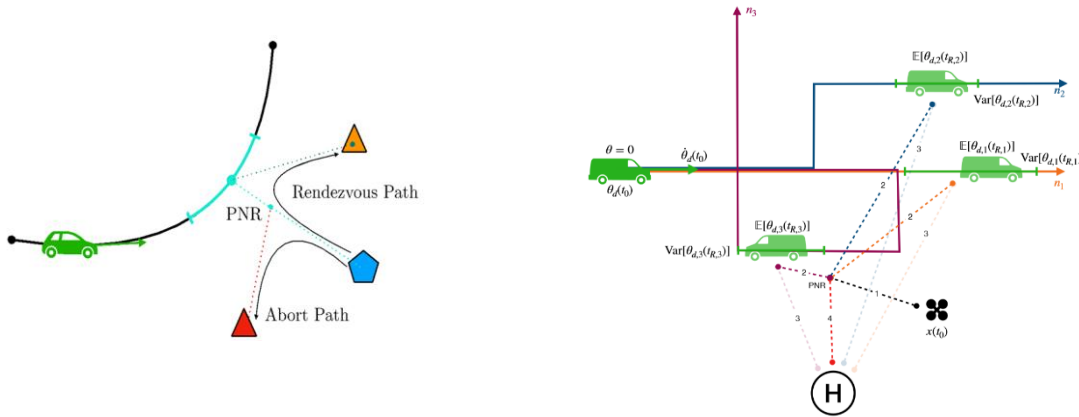
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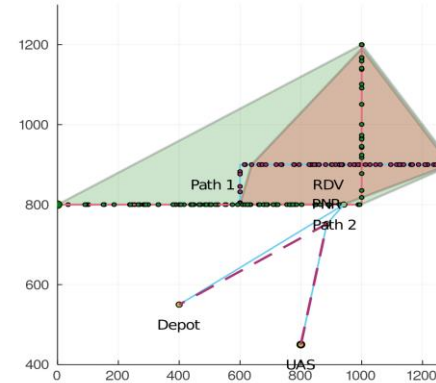
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## Risk Sensitive Rendezvous



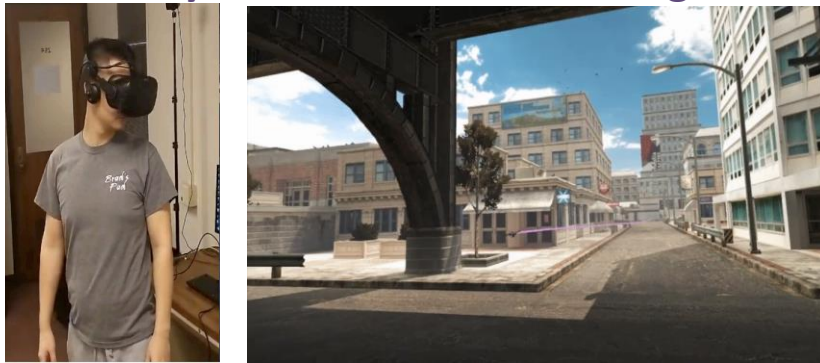
G. Haberfeld, A. Gahlawat, and N. Hovakimyan, "Safe Sampling-Based Air-Ground Rendezvous Algorithm for Complex Urban Environments," in preparation for ICUAS 2021



A computationally tractable algorithm for **risk-aware rendezvous planning**

- Planning over multiple possible paths;
- Sampling based method relying on cross-entropy information updates.

## Socially-Aware Motion Planning



H. J. Yoon, P. Zhao, C. Tao, C. Widdowson, R. F. Wang, N. Hovakimyan, and E. Theodorou, "Socially Aware Motion Planning for a Flying Robot with Model Predictive Path Integral Control," ICRA 2019 Workshop.

A motion control framework for a flying drones that takes into account **the safety perception of humans in close proximity**

- Human's safety perception is predicted based on data collected from physiological experiments in a virtual reality (VR) environment;
- The predicted safety perception is incorporated in optimal control of the robot's motion based on model predictive path integral (MPPI) control;
- Generates perceived-safe motion of the robot online, accounting for changes in the environment in real time.

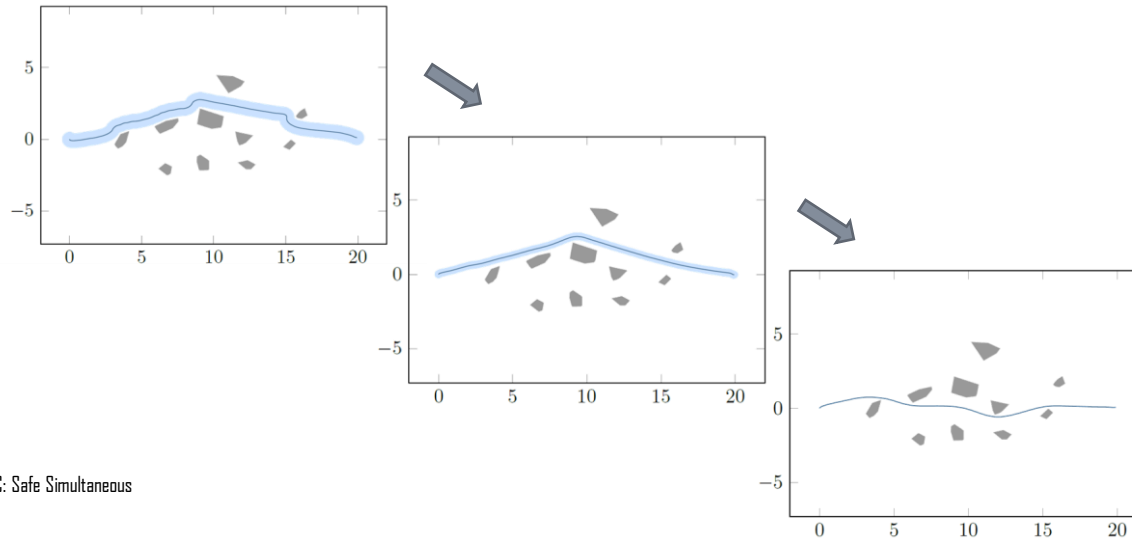
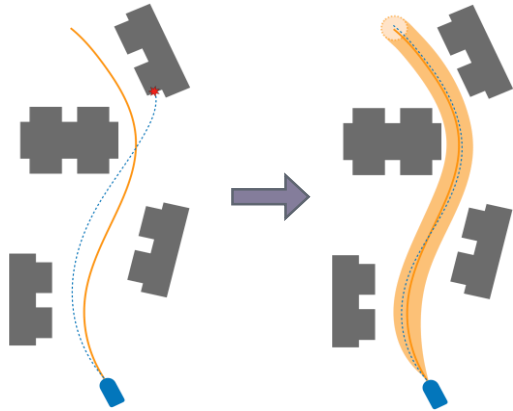
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## Safe Learning-based Control

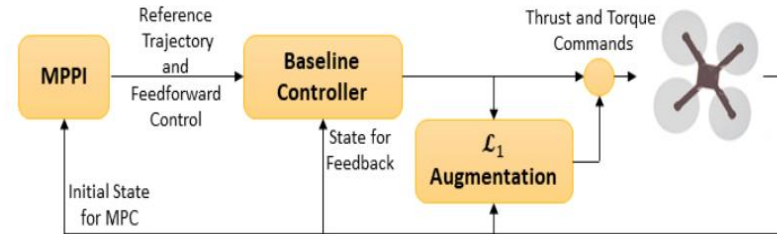
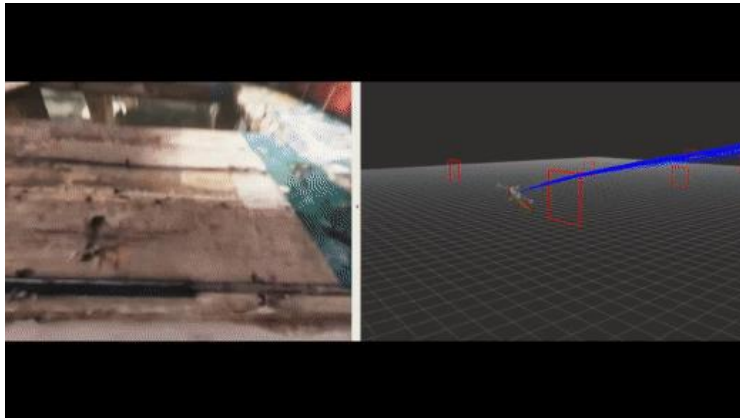


A. Gahlawat, A. Lakshmanan, L. Song, A. Patterson, Z. Wu, N. Hovakimyan, and E. Theodorou, "SZLC: Safe Simultaneous Learning and Control," under review at L4DC 2021

Planner-agnostic approach for certified safety

- Contraction theory with  $\mathcal{L}_1$  adaptive control;
- **Safety decoupled from Bayesian learning;**
- Guaranteed safety in the form of tubes for assured planning.

## Robust & Agile Control of Multirotors



Pravitra, J., Ackerman, K. A., Gao, C., Hovakimyan, N., and Theodorou, E. A. LI-Adaptive MPPI Architecture for Robust and Agile Control of Multirotors. International Conference on Intelligent Robots and Systems, 2020.

A sampling-based predictive control architecture

- Model Predictive Path Integral (MPPI) control solves nonlinear MPC in real-time;
- $\mathcal{L}_1$  adaptive control robustifies the architecture;
- System performance behavior mirrors **nominal dynamics** considered by MPPI.