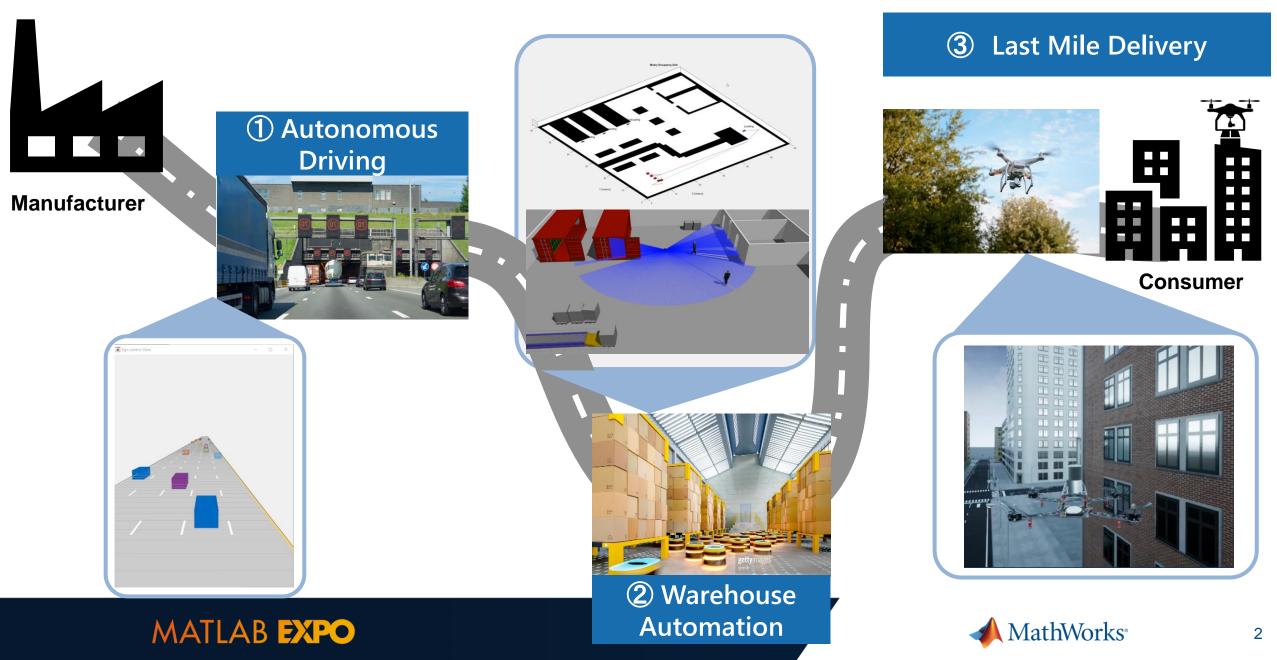
MATLAB EXPO

Sensor Fusion and Navigation for Autonomous Systems Using MATLAB & Simulink



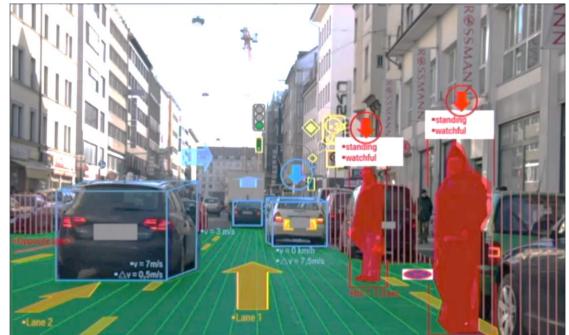


#### Smart autonomous package delivery



## **Capabilities of an Autonomous System**



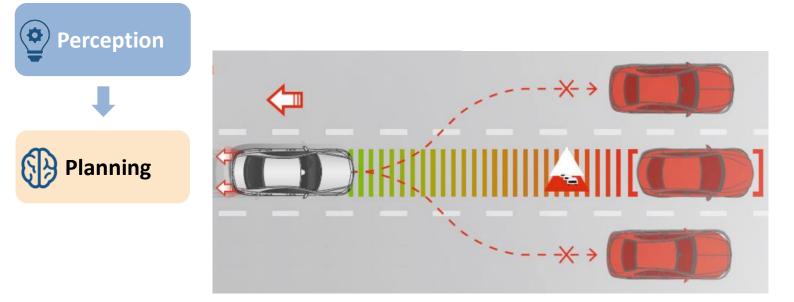


# Some common Perception tasks

- Design localization algorithms
- Design environment mapping algorithms
- Design SLAM algorithms
- Design fusion and tracking algorithms
- Label sensor data
- Design deep learning networks
- Design radar algorithms
- Design vision algorithms
- Design lidar algorithms
- Generate C/C++ code



#### **Capabilities of an Autonomous System**

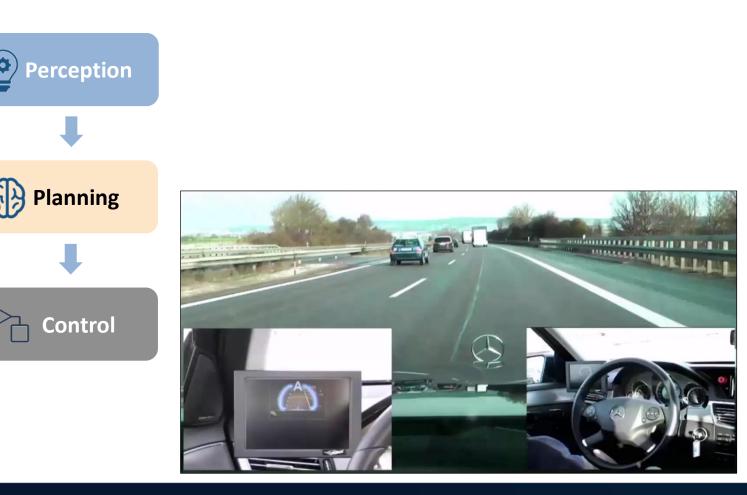




- Visualize street maps
- Connect to HERE HD Live Map
- Design local and global path planners
- Design vehicle motion behavior planners
- Design trajectory generation algorithms
- Generate C/C++ code



#### **Capabilities of an Autonomous System**

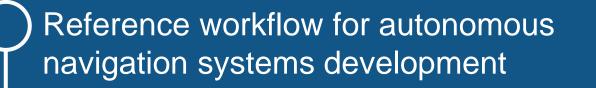


#### Some common Control tasks

- Connect to recorded and live CAN data
- Design reinforcement learning networks
- Model vehicle dynamics
- Automate regression testing
- Prototype on real-time hardware
- Design path tracking controllers
- Design model-predictive controllers
- Generate production C/C++ code
- Generate AUTOSAR code
- Certify for ISO26262

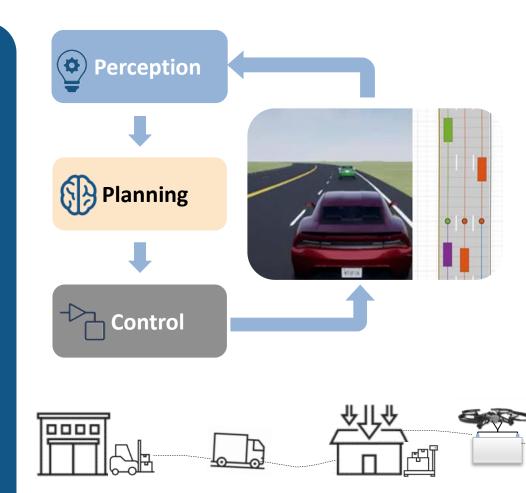


## In this talk, you will learn



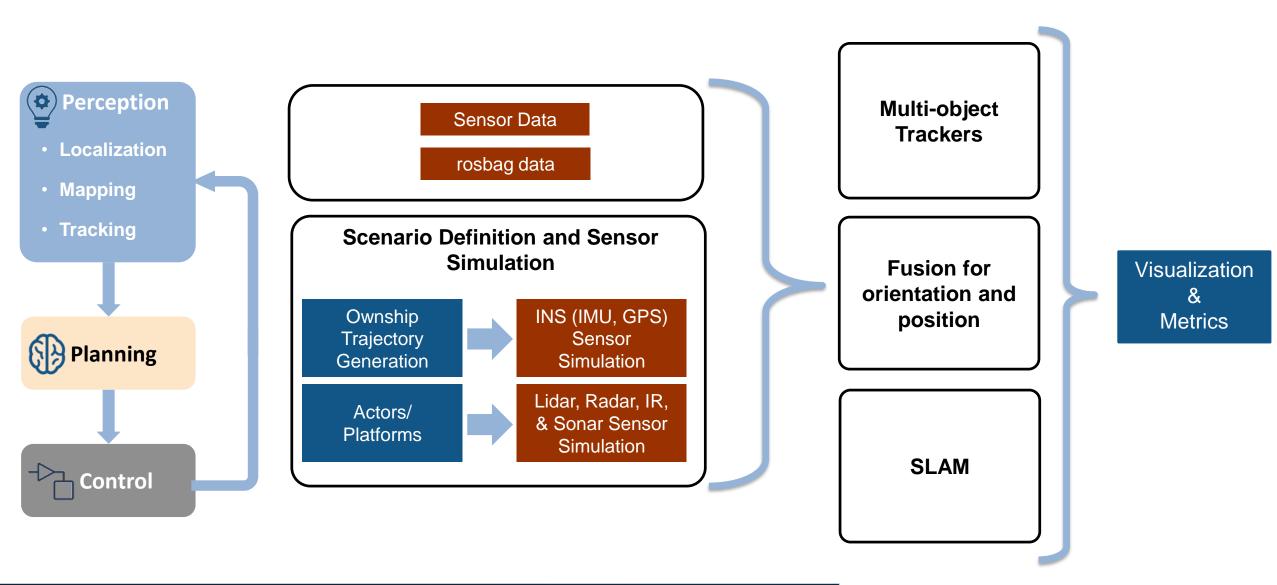
MATLAB and Simulink capabilities to design, simulate, test, deploy algorithms for sensor fusion and navigation algorithms

- Perception algorithm design
- Fusion sensor data to maintain situational awareness
- Mapping and Localization
- Path planning and path following control





## Many options to bring sensor data to perception algorithms

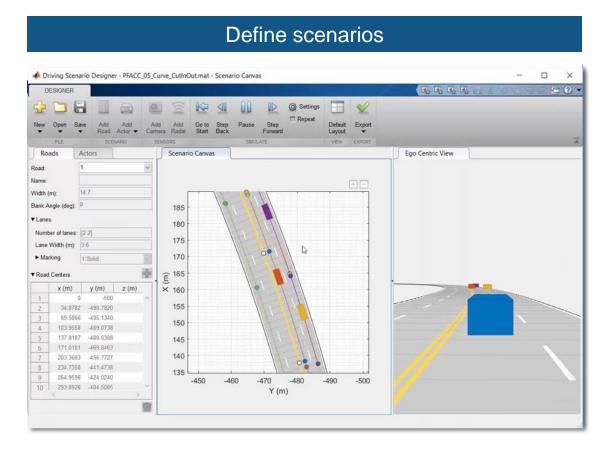




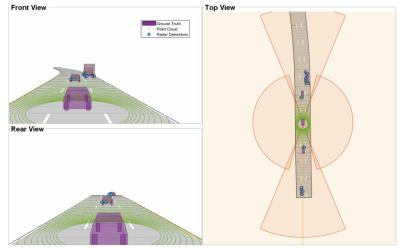


#### Live data can be augmented for a more robust testbench



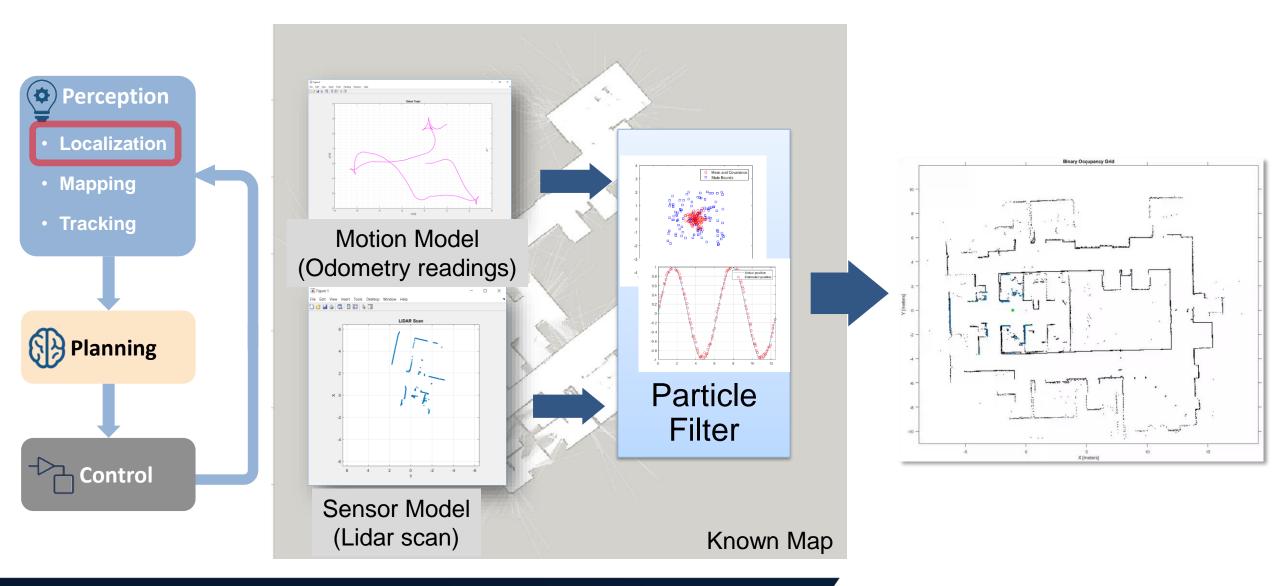


#### Simulate sensors





#### **Estimate the pose using Monte Carlo Localization**



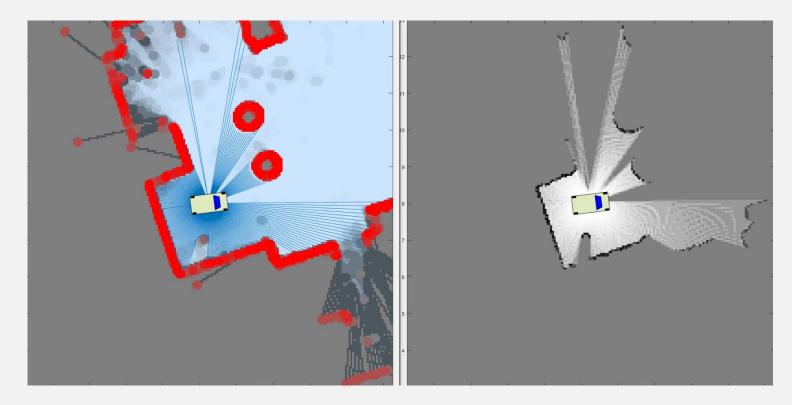


#### What is the world around me? Egocentric occupancy maps

#### **Dynamic Environment**

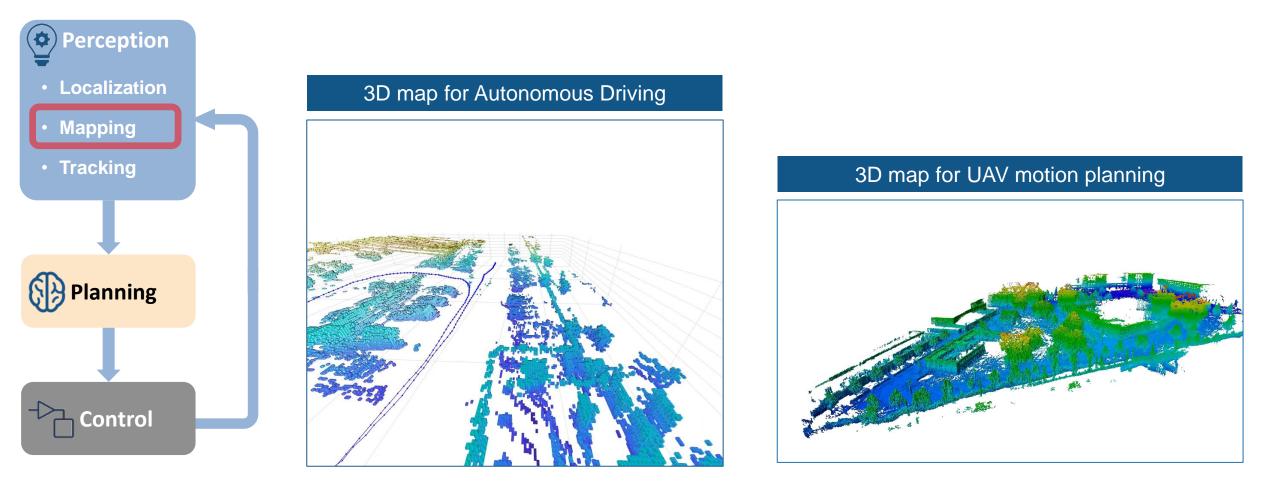
erception • Localization Mapping • Tracking Planning Control

- Support dynamic environment changes
- Synchronization between global and local maps





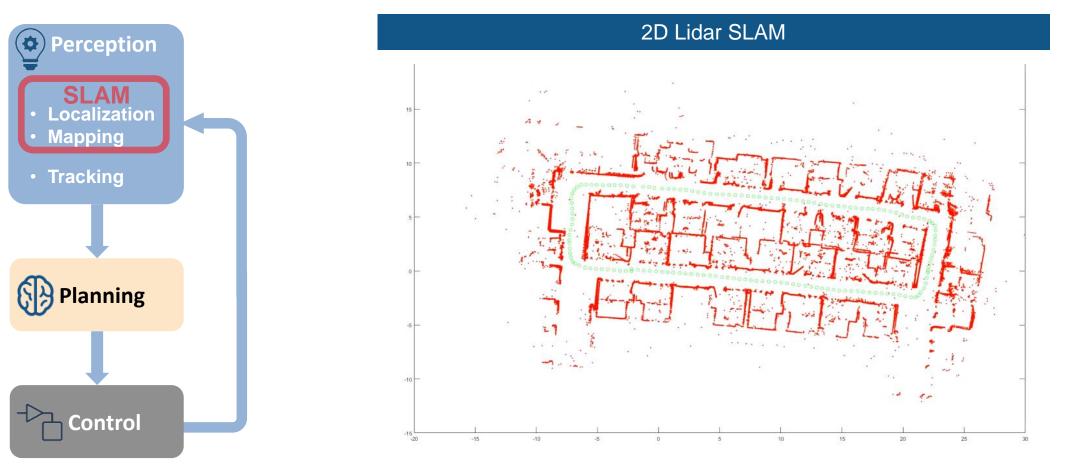
#### What is the world around me? 3D Occupancy Map





# Where am I in the unknown environment?

Simultaneous Localization and Mapping (SLAM)

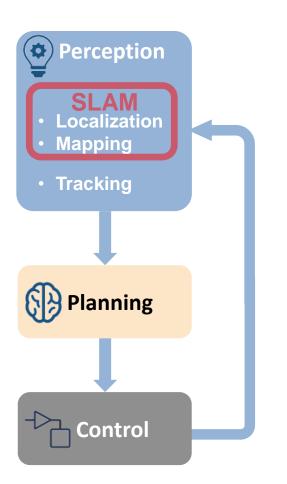


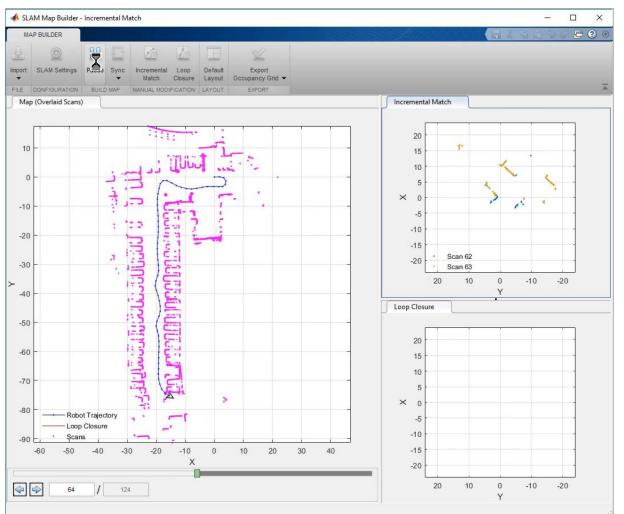
Build a map of an unknown environment while simultaneously keeping track of robot's pose.





#### Simultaneous Localization and Mapping SLAM Map Builder App (2D only)

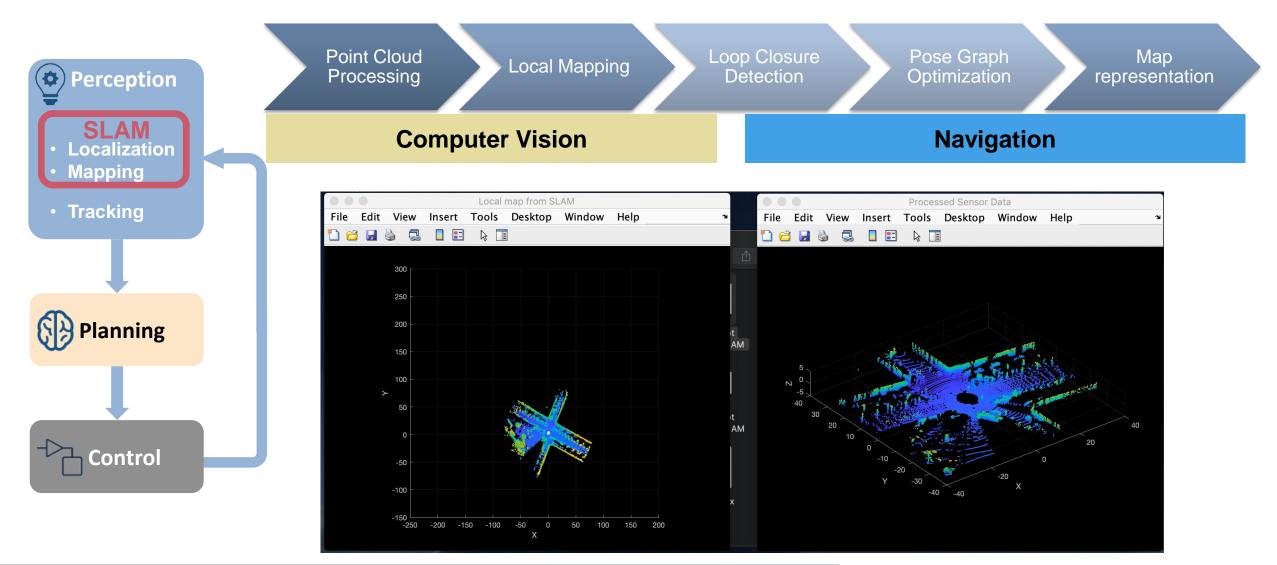




App enables more interactive and user-friendly workflow

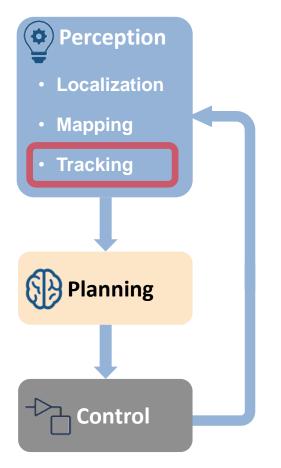


#### Simultaneous Localization and Mapping 3D Lidar SLAM

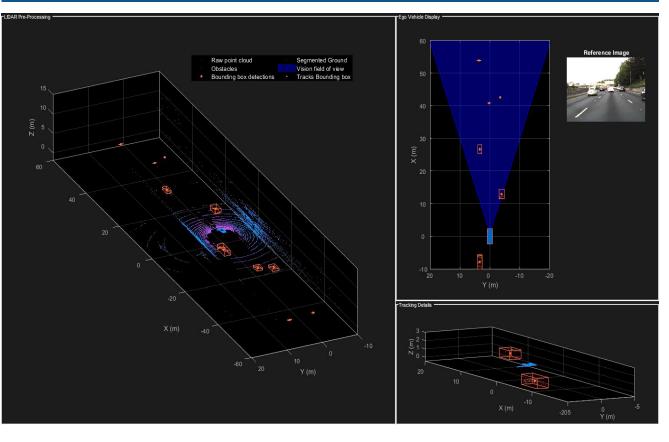




#### Autonomous systems can track objects from Lidar point clouds



#### Track Objects Using Lidar: From Point Cloud to Track List

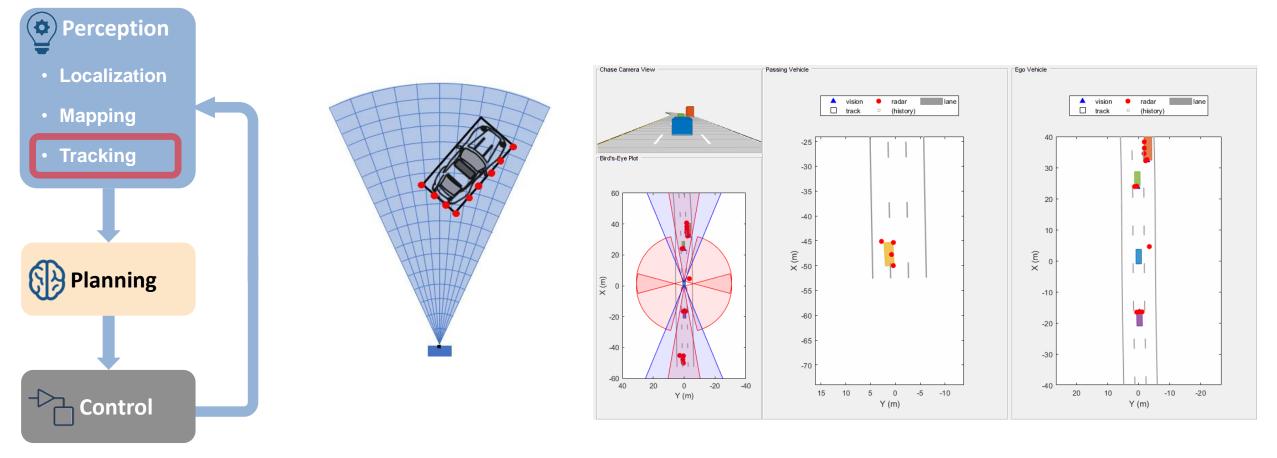


Track surrounding objects during automated lane change





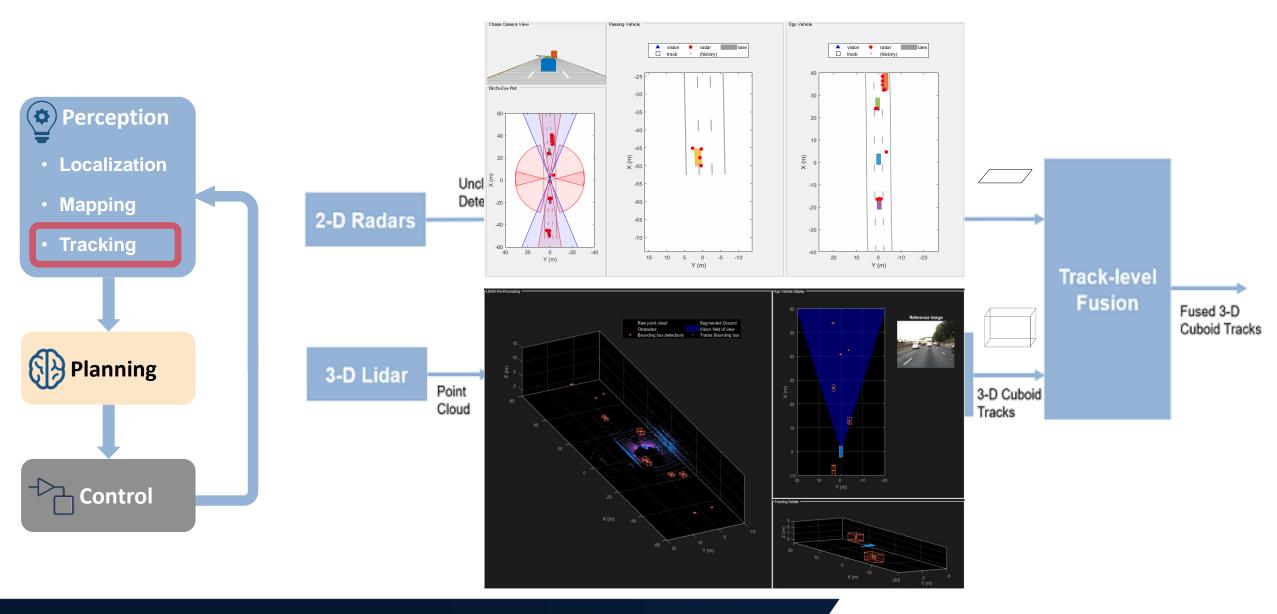
#### 2D radar can be used to track position, size, and orientation





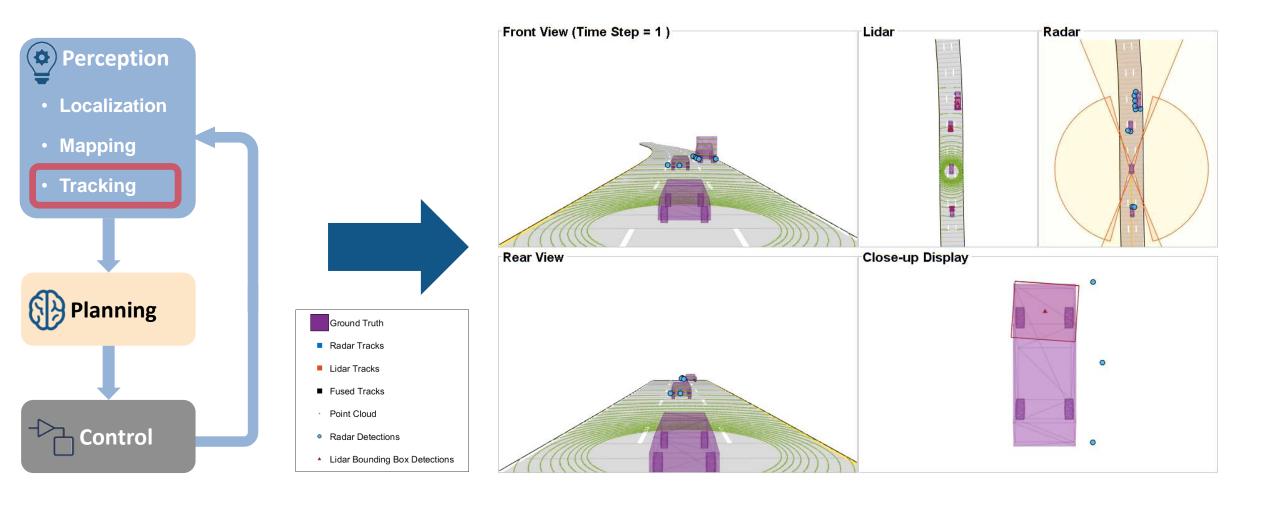


#### Fusing multiple sensor modalities provides a better result



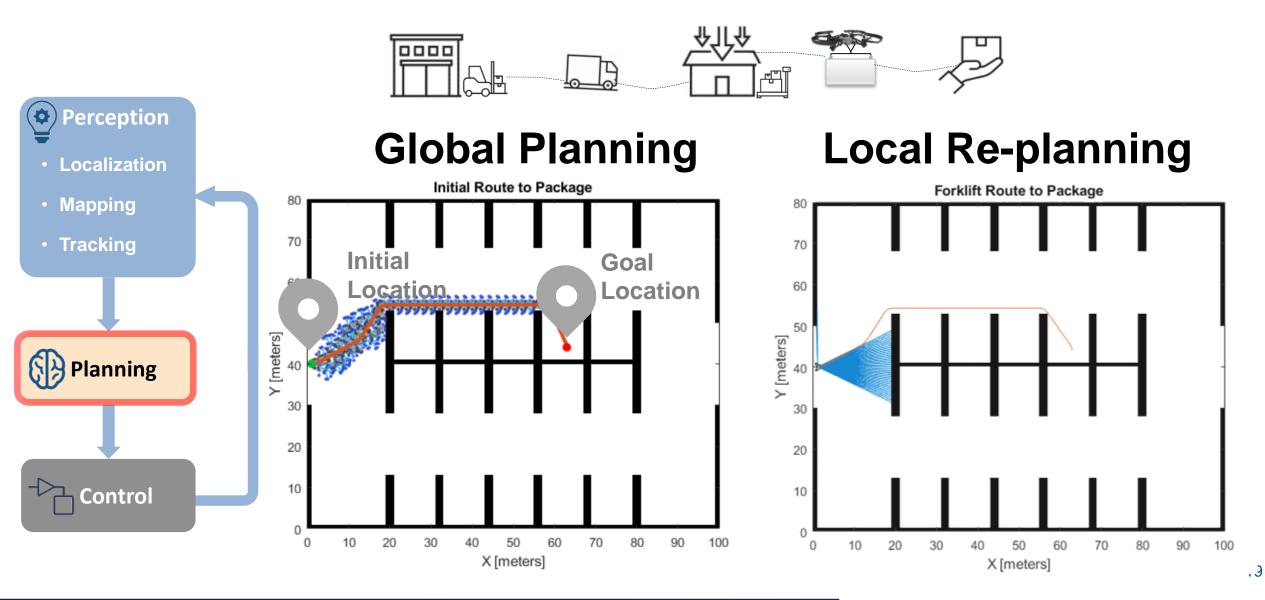


#### Radar and Lidar fusion can increase tracking performance





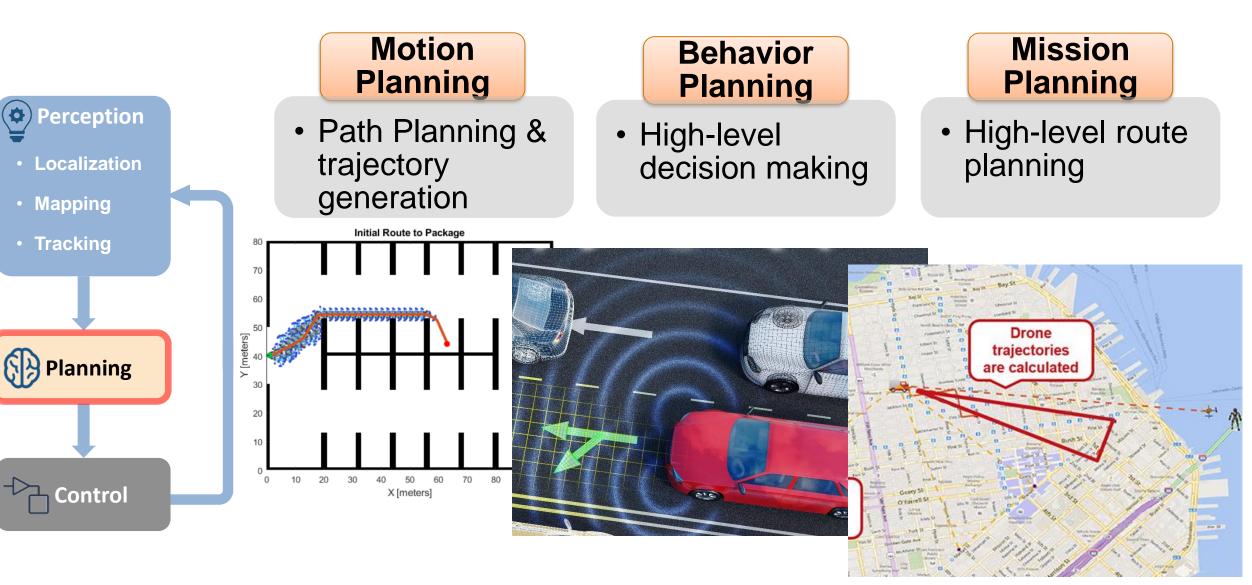
#### Find shortest path to the destination





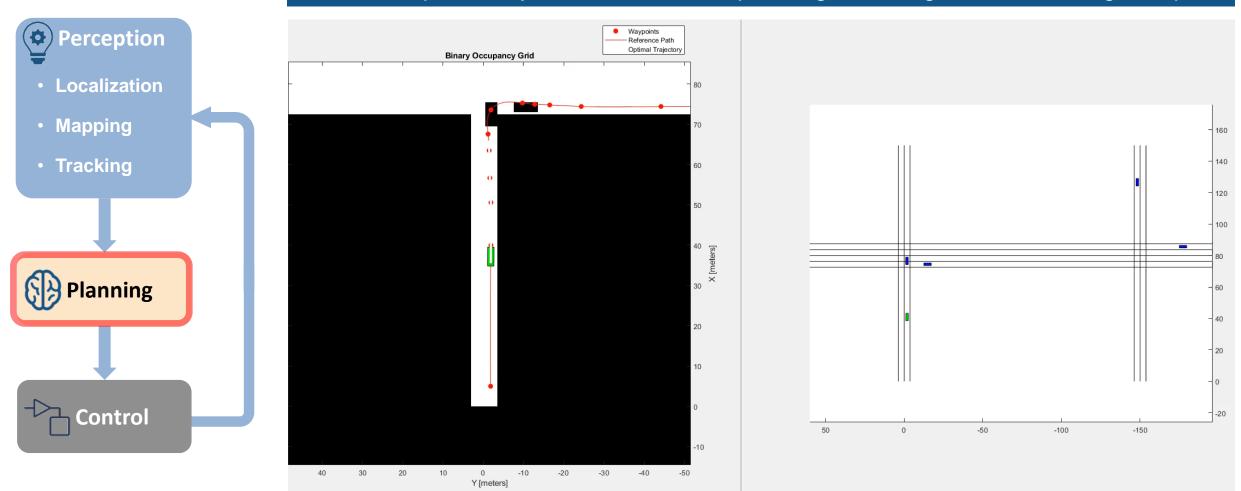


#### Find shortest path to the destination





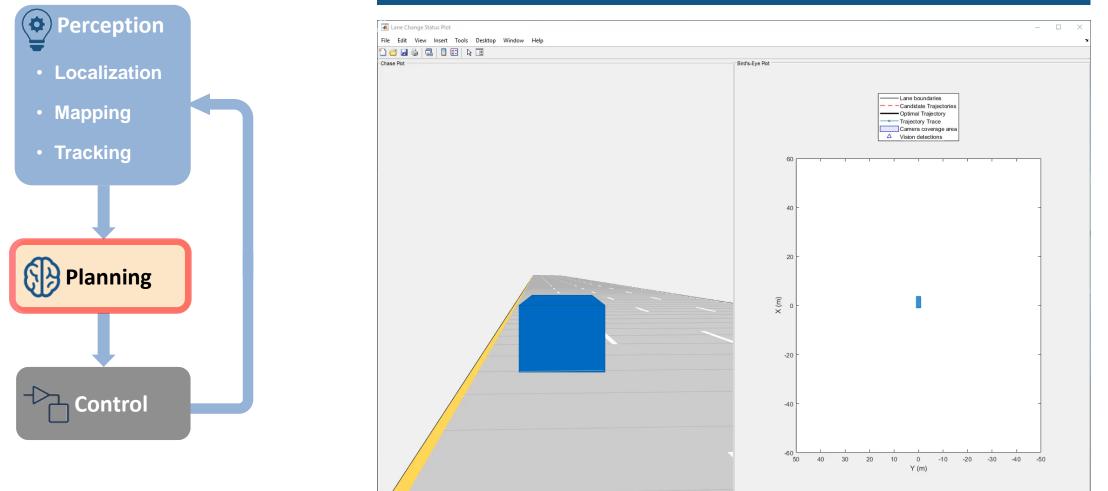
#### Urban driving needs planning on two levels, global and local



#### Generate optimal trajectories for local re-planning and merge back with the global plan



#### Simulate shortest path to change lanes on a highway

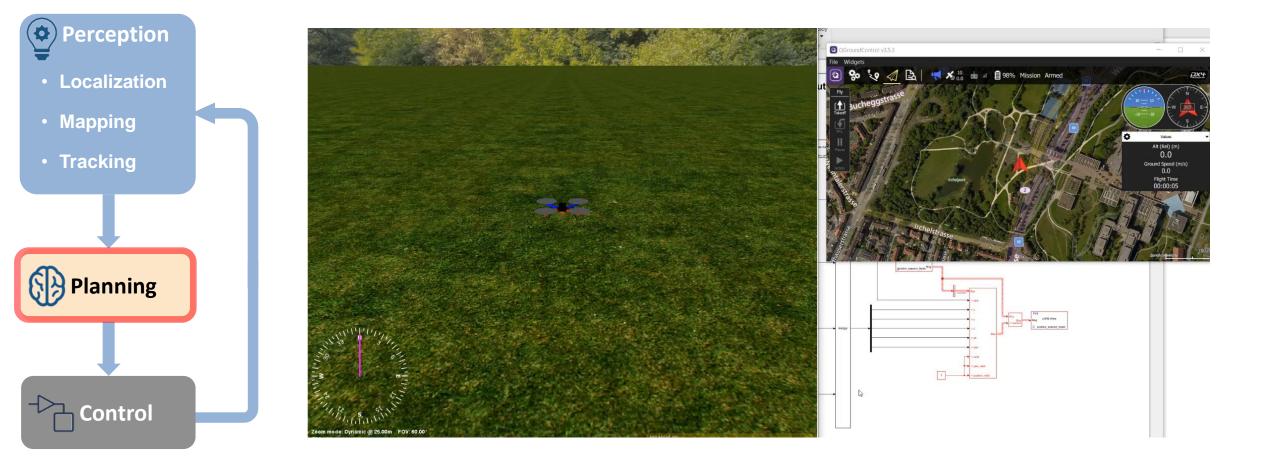


#### Simulate trajectory generation and the lane change maneuver





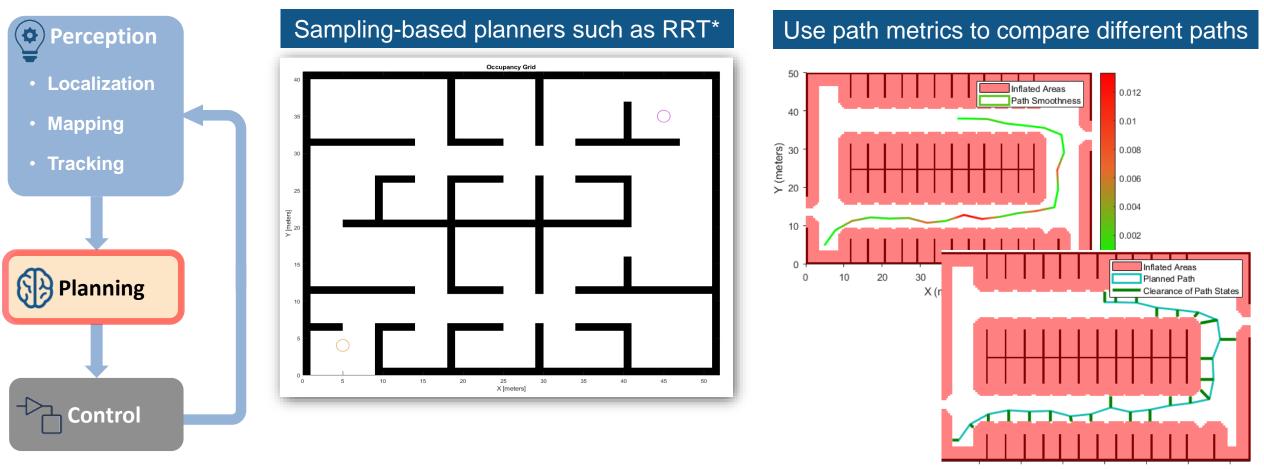
## Mission planning for UAV leads to last mile delivery







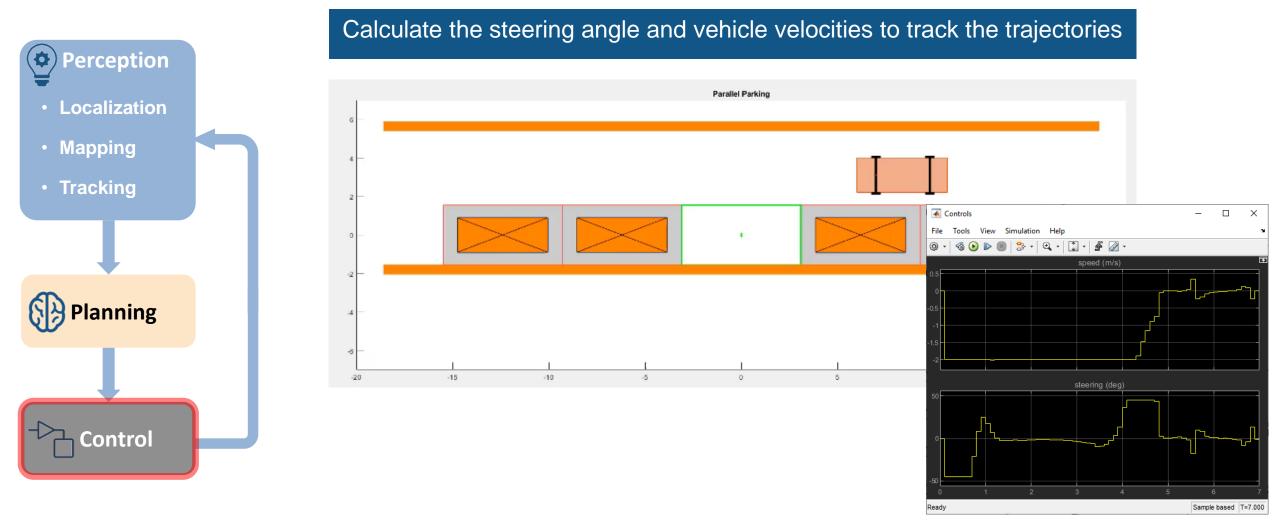
#### Choose a path planner based on your application



10 20 30 40 50 60 70 X (meters)



#### Send control commands to the vehicle to follow the planned path

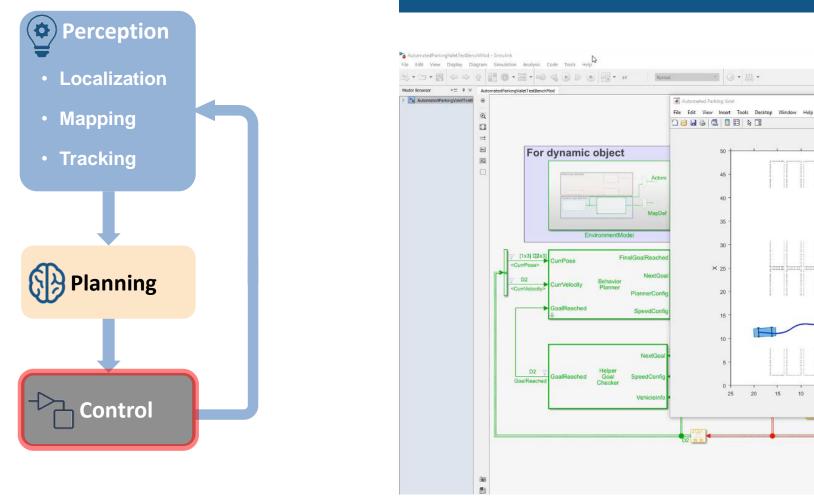


#### MATLAB EXPO



25

#### Avoid pedestrian (dynamic obstacles) in a parking lot



#### Define control commands to avoid potential collision

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20 15 10



Vehiclelr

assessment

RefVe

VehicleInfo

÷ Observer

0

-15 -20

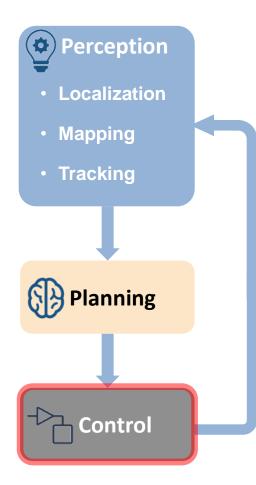
-25

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## **Control lane change maneuver for highway driving**

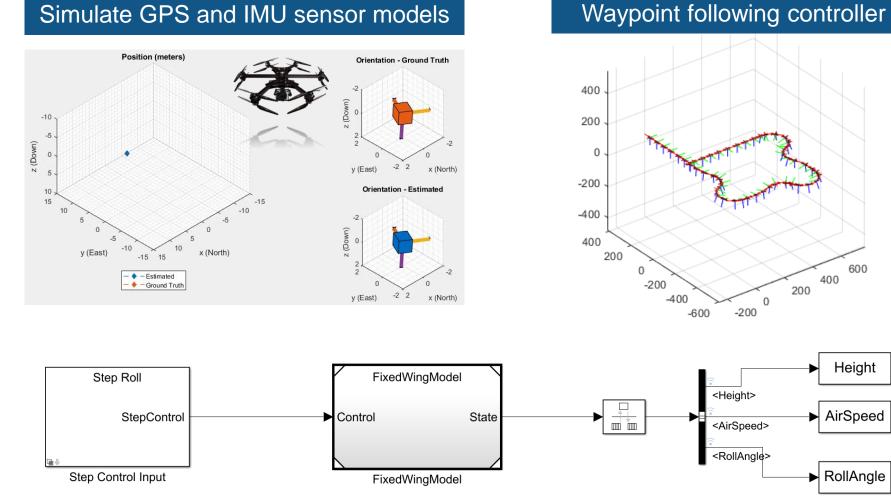


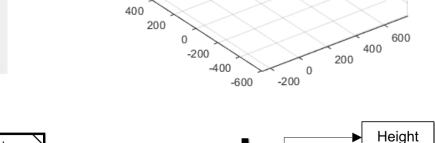
#### Longitudinal and Lateral Controllers to adjust the acceleration and steering





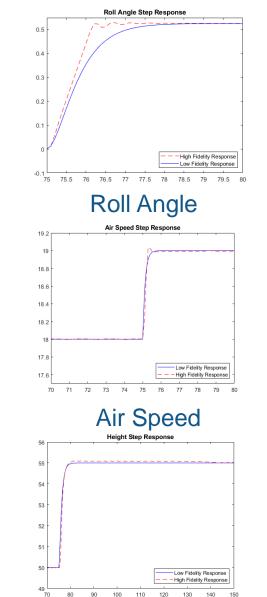
#### Simulate high-fidelity UAV model with waypoint following





AirSpeed

RollAngle



Height

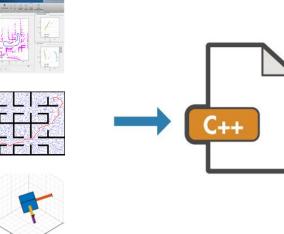
MathWork

Approximate High-Fidelity Model with Low-Fidelity Model

#### Generate code and deploy sensor fusion and navigation algorithms

MATLAB Coder™

#### Simulink Coder™





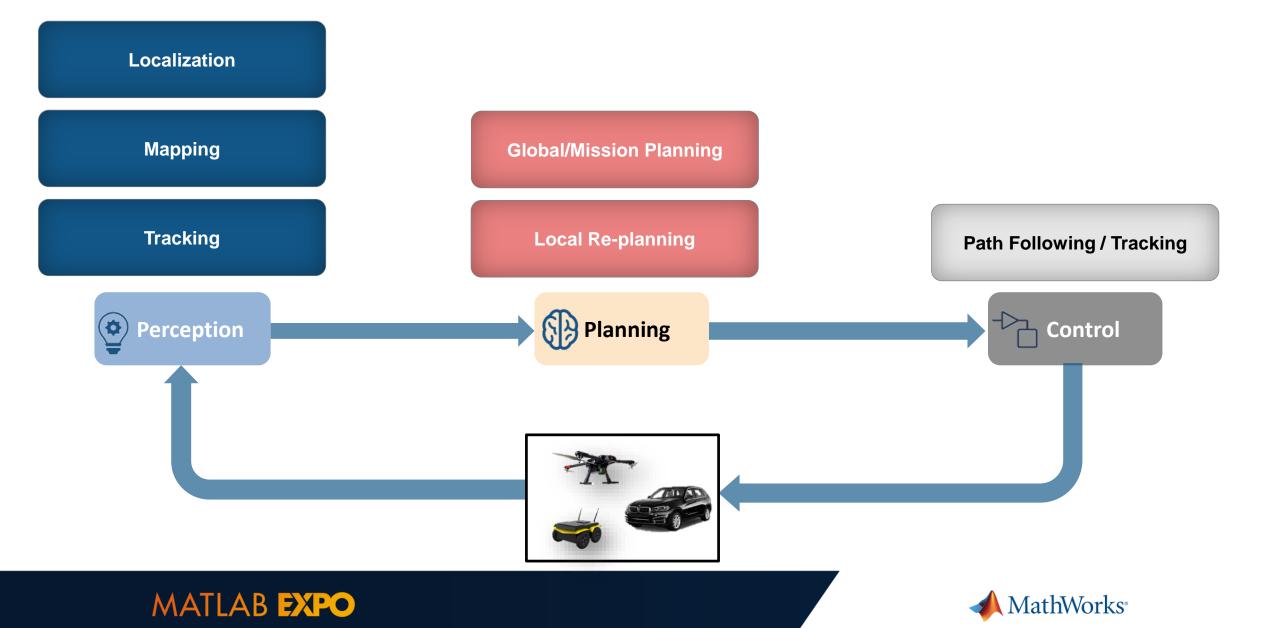




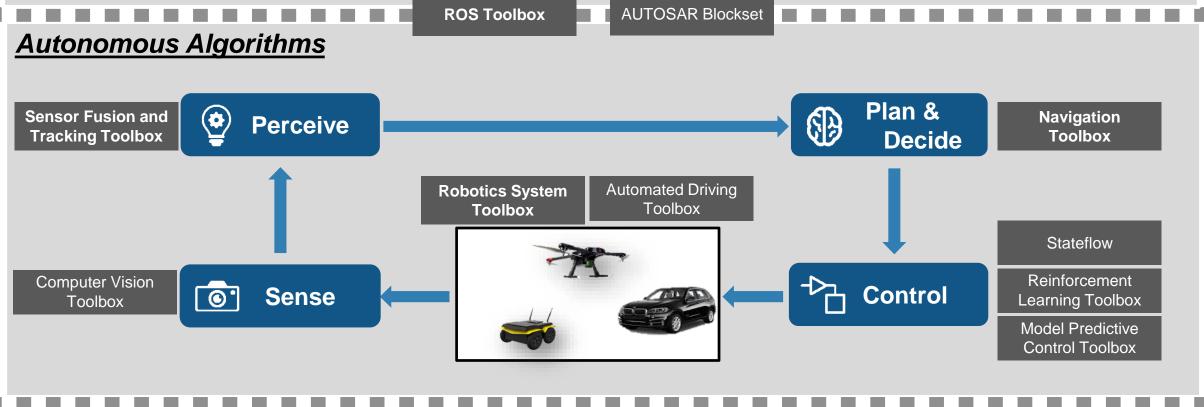




#### In this talk, we learnt about..



# Full Model Based Design Workflow for Autonomous Systems Verification & Validation Code Generation Connect / Deploy Code Generation



 Platform
 MATLAB
 Simulink



#### There are many resources to get started with













#### ypes of Tracking Filters and How to Choose the Right One Alpho-Beto Sub-optimal Kalman Ontrael for lawar and Uses linearized models to pro Extended Kolmo ~ Samples the uncertain Unscented Kalman $\checkmark$ ~ propagate it. May become numerica unstable in single-precision. 1 $\checkmark$ Samples the uncertainty covaria propagate it. Numerically stable Cubature Kalman Assumes a veighted sum Good for partially abservable cases (e.g., angle-only tracking). $\checkmark$ Assumes a weighted sum of distributions Interacting Multiple Models [WWI] Multiple Models Moneuvering objects (e.g., accelerates, turns) Particle ~ and be any another the uncertainty detribution store Quick Start Guide





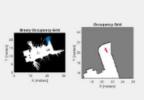
#### Part 1: What is Sensor Fusion?

This video provides an overview of what sensor fusion is and how it helps in the design of autonomous systems. It also covers a few scenarios that illustrate the various ways in which sensor fusion can be implemented.



#### Part 2: Fusing a Mag, Accel, and Gyro to Estimate Orientation

This video describes how we can use a magnetometer, accelerometer, and a gyro to estimate an object's orientation. The goal is to show how these sensors contribute to the solution, and to explain a few things to watch out for along the way.



#### Create Egocentric Occupancy Maps using Range Sensors

Create an egocentric occupancy map by using ray-tracing with our rangeSensor sensor model.

Open Live Script



Simulate an automated lane chang maneuver system for highway driving scenario.

Open Live Script

Please visit our Tech Showcase demos



# Thank you!

# Questions?



