

# Autonomous Vehicle Planning and Control

Wu Ning



**What's Autonomous Vehicle?**



## What's Autonomous Vehicle?



**What are the different levels in  
Autonomous Vehicle?**

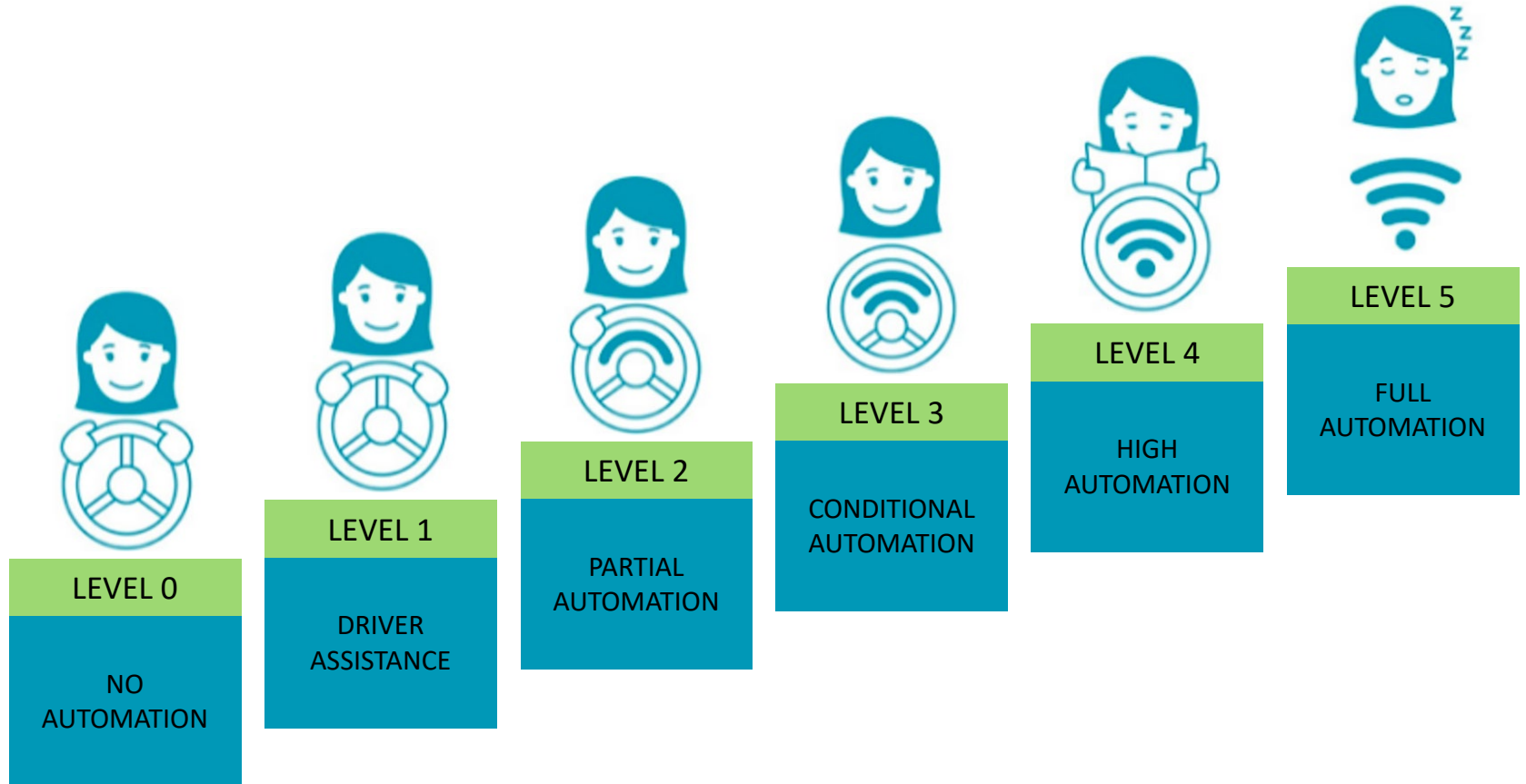


## SAE autonomous level

Level	Short name	Details and example product
Level 0	No control	The automated system issues warnings and may momentarily intervene but has no sustained vehicle control.
Level 1	Hands on	The driver and the automated system share control of the vehicle. Example: Cruise control, ACC, LKA
Level 2	Hands off	The automated system takes full control of the vehicle: accelerating, braking, and <a href="#">steering</a> . The driver must monitor the driving and be prepared to intervene immediately at any time if the automated system fails to respond properly. Example: "Super-Cruise" in the Cadillac CT6 by General Motors or Ford's F-150 BlueCruise.
Level 3	Eye off	The driver can safely turn their attention away from the driving tasks, e.g. the driver can text or watch a film.
Level 4	Mind off	self-driving is supported only in limited spatial areas ( <a href="#">geofenced</a> ) or under special circumstances.
Level 5	Fully auto	No human intervention is required at all. An example would be a robotic vehicle that works on all kinds of surfaces, all over the world, all year around, in all weather conditions.



## SAE autonomous level





## SAE autonomous level

**Level 3:** The driver can safely turn their attention away from the driving tasks, e.g. the driver can text or watch a film. Like co-driver that will alert you in an orderly fashion when it is your turn to drive.

**Achieved:** The vehicle will handle situations that call for an immediate response, like emergency braking.

**Limitation:** The driver must still be prepared to intervene within some limited time, specified by the manufacturer, when called upon by the vehicle to do so.

**Example:** a Traffic Jam Pilot



LEVEL 3

CONDITIONAL  
AUTOMATION



## SAE autonomous level

**Level 4:** the driver may safely go to sleep or leave the driver's seat.

**Achieved:** As level 3, but no driver attention is ever required for safety under certain condition.

**Limitation:** self-driving is supported only in limited spatial areas ([geofenced](#)) or under special circumstances. Outside of these areas or circumstances, the vehicle must be able to safely abort the trip, e.g. slow down and park the car, if the driver does not retake control.

**Example:** a robotic taxi or a robotic delivery service that covers selected locations in an area, at a specific time and quantities



LEVEL 4

HIGH  
AUTOMATION





## SAE autonomous level

**Level 5:** No limitation!

This is the dream of autonomous driving!

# Ultimate GOAL!



LEVEL 5

FULL  
AUTOMATION



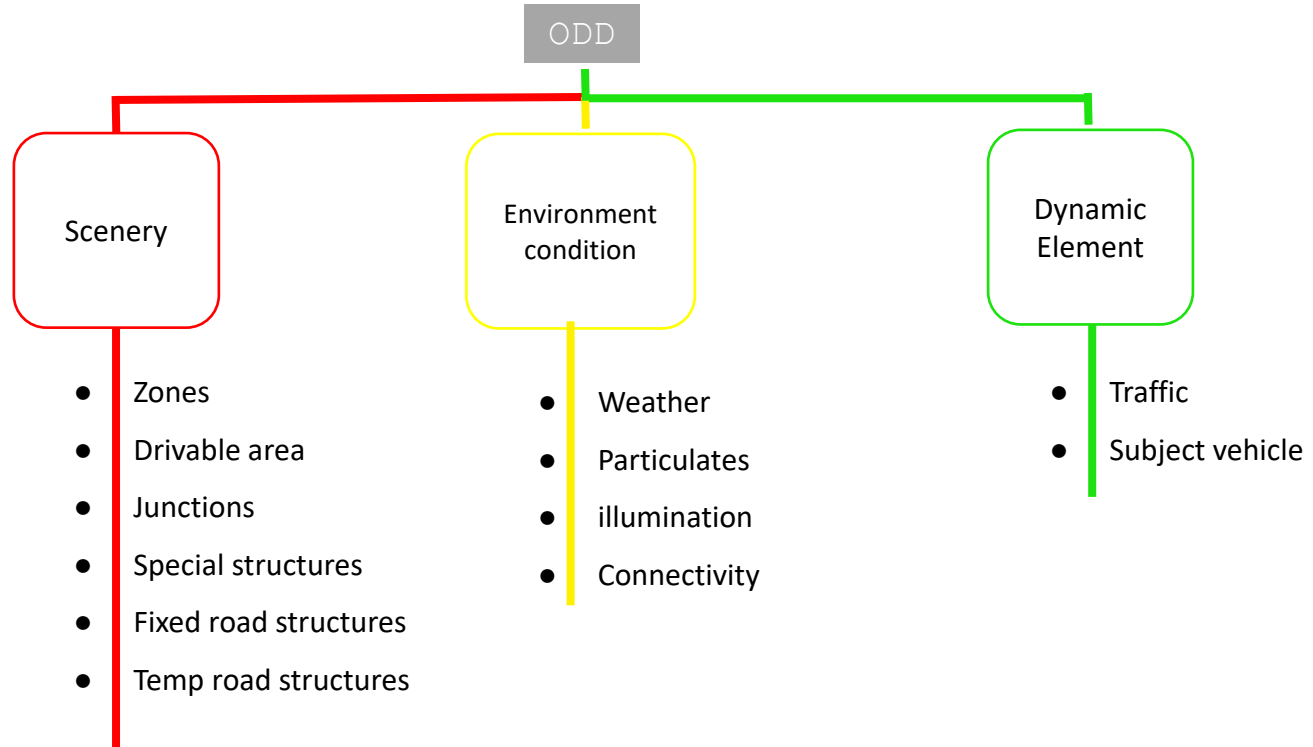
## Operational Design Domain (ODD)

“Operation conditions under which a given driving automation system or feature thereof is specifically designed to function, including, but not limited to, environmental, geographical, and time-of-day restrictions, and/or the requisite presence or absence of certain traffic or roadway characteristics”

- SAE J3016 (2018)

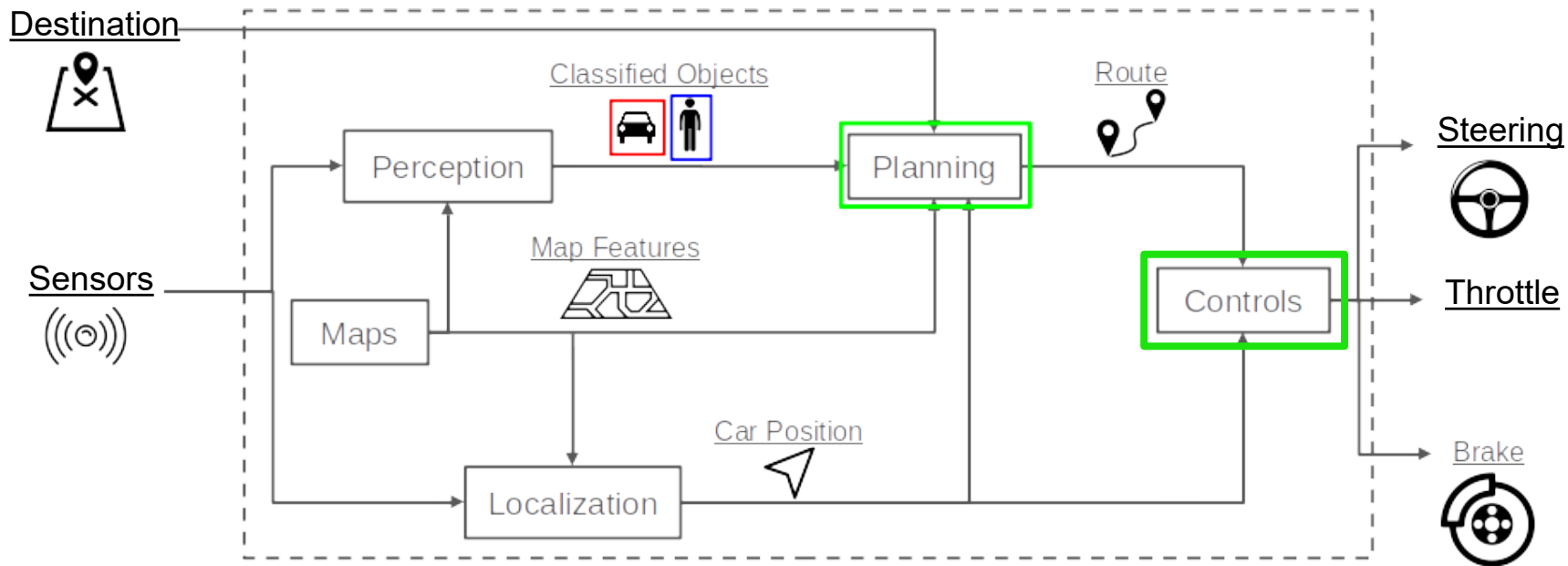


# Operational Design Domain (ODD)





# General Architecture of Autonomous Vehicle



# Localization Key components in Autonomous Vehicle

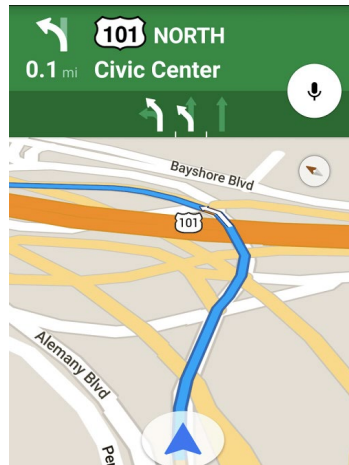
**Goal:** Estimates position and orientation of car relative to map; Used by Planner/Controller to follow path

## Input:

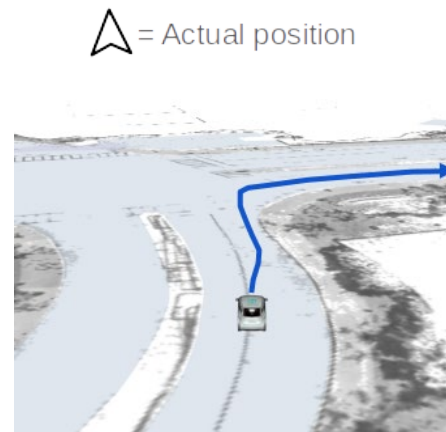
- Map,
- GPS (inaccurate),
- Motion sensors: odometry: (speedometer, IMU) (error accumulation),
- LiDAR (Particle and Kalman filters),

## Output:

- Vehicle position/orientation.



Bad localization =  
reroute/ replan



Bad localization = swerve into other  
objects



# Mapping/HD map Key components in Autonomous Vehicle

**Goal:** Give planer, perception location based Pre-information:

**Input:** Map annotation

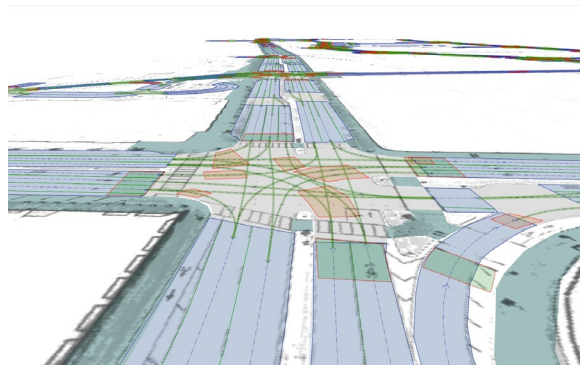
**Output:**

Main object types:

- Generic Area
- Intersections
- Road block (and RB connectors)
- Lane (and road/lane dividers, lane edges)
- Baseline path

“Add-on” objects types:

- Crosswalk
- Stop line (various types)
- Precedence Areas
- Traffic Lights
- Walkways
- Parking Area
- Slow zones\*



HD map issues: expensive (annotation and maintenance)

# Perception Key components in Autonomous Vehicle

**Goal:** Understand the world around the vehicle, and classify objects in the environment;

## Input:

(Map), Sensor data:

- LiDAR
- Radar
- Camera ..

## Output:

Information about the objects in the environment:  
position, classification, speed and other information.



# **Prediction** Key components in Autonomous Vehicle

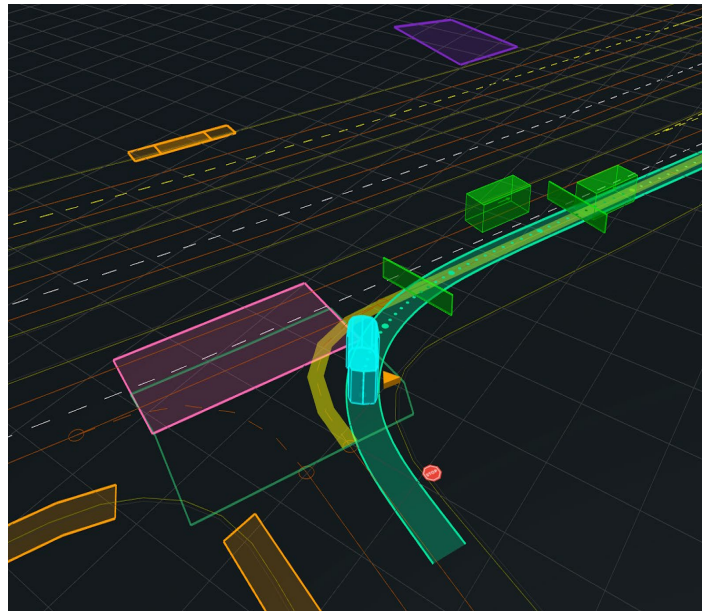
**Goal:** A system attempts to understand the intents of agents in the environment.

## **Input:**

output- Information about the objects in the environment:  
pos, classification and speed;

## **Output:**

Future behaviors for agents; (trajectory + probabilities)







# Planner Key components in Autonomous Vehicle

**Goal:** Provide the controller the safest, correct, predictable and comfortable navigation.

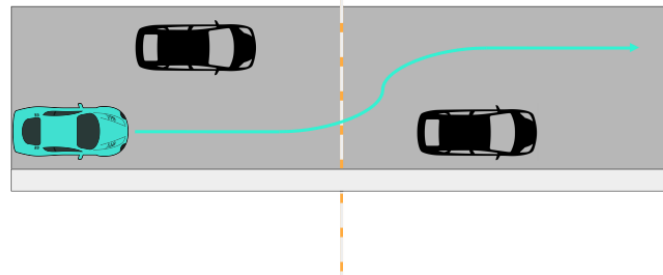
## Input:

- Perception: provide us the perceived actual dynamic state of the environment
- Map: provide the prior information
- Localization: provide the current state estimate of the ego vehicle

## Output:

- Controller: provide a feasible path and bounds (lateral and longitudinal) for the vehicle to track and stay within.
- Perception: sometimes provide the area affecting our assessment of behaviors.

Problems





## Controller Key components in Autonomous Vehicle

**Goal:** To accurately execute the Planner's requested plan by understanding the vehicle's dynamic state, and actuating it (e.g., throttle, brake, steering, gear, ...). Optimize for passenger comfort within the bounds of the Planner's requested plan.

### Input:

- Planner
- Localization

### Output:

Trajectory, steering, speed or throttle/brake



**What's PnC (Planning and Control) in Autonomous Vehicle?**



# Basic Planning Control Architecture

- Classical decompose approaches:
  - Breakdown into long, medium, short term horizons
  - Breakdown of spatial path vs velocity planning
  - Homotopy search vs optimization
- Common DARPA urban challenge 2007 structure





# Mission/Route Planning

**Goal:** Find preferred route (or routes) over the road network

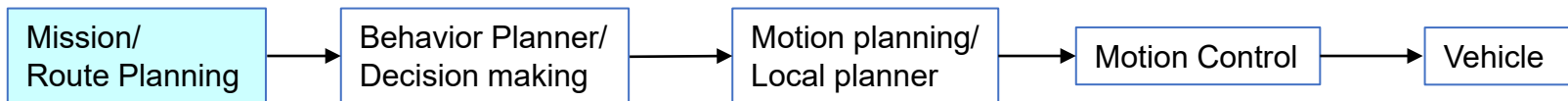
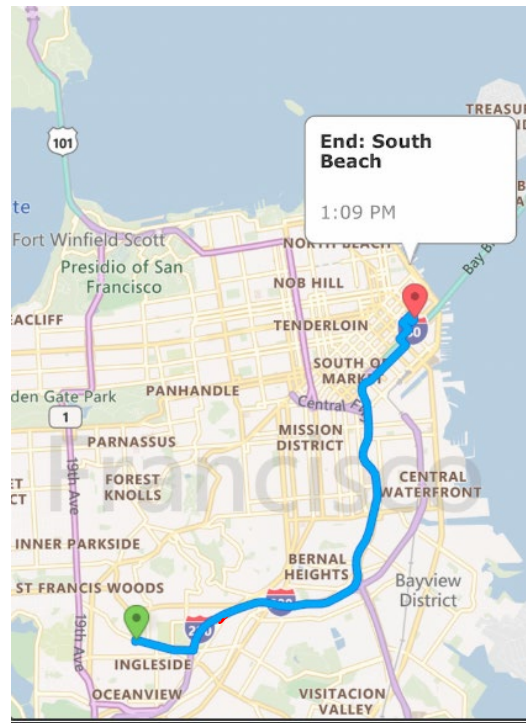
**Input:** Start, goal (pick-up/drop-off location), graph, cost function

**Output:** sequence of lanes/road segments (route)

**Common Tech Approach:** Graph search (Dijkstra, A\*, et al)

Many algorithms shared with local planning methods.

- could plan for lane/connector route rather than laneGroup/intersection
- Cost function could penalize lane changes, turns (left or right), narrow lanes, etc.





# Behavioral Decision Making

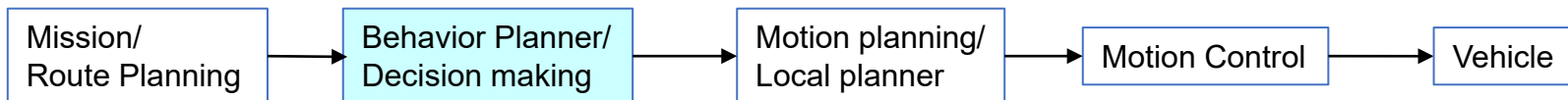
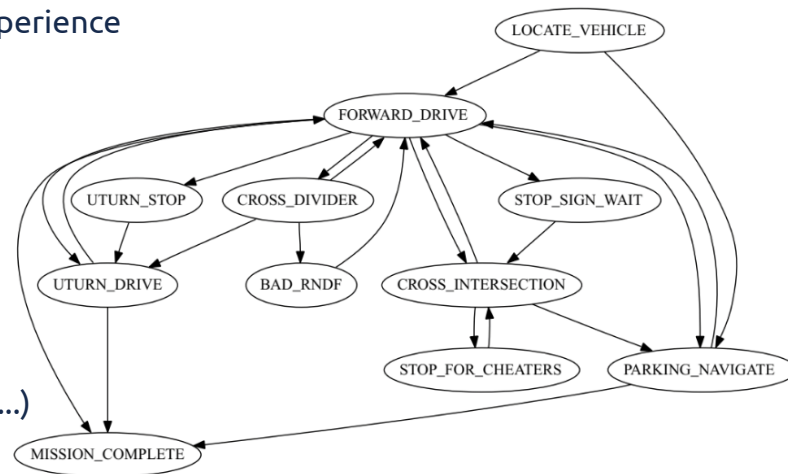
**Goal:** Determine high level actions: Eg. change lane now or later, stick to left or right lane, stop/go for crosswalk intersection

**Input:** Planner, localization, Map, Traffic rules, human experience

**Output:** Planner high level decision

## Common Tech Approach:

- Finite State Machine
- Rule based approach: Minimum Violation Planning
- Formal Methods (STL, LTL, process algebra,  $\mu$ -calculus,...)
- Markov Decision Process





# Motion planning/Local Planning

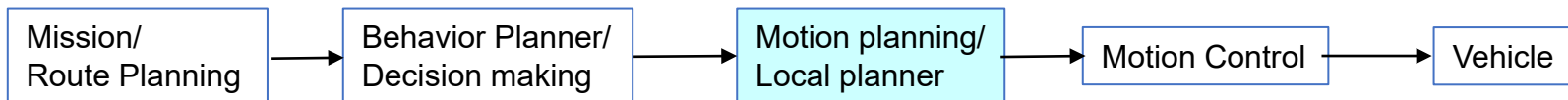
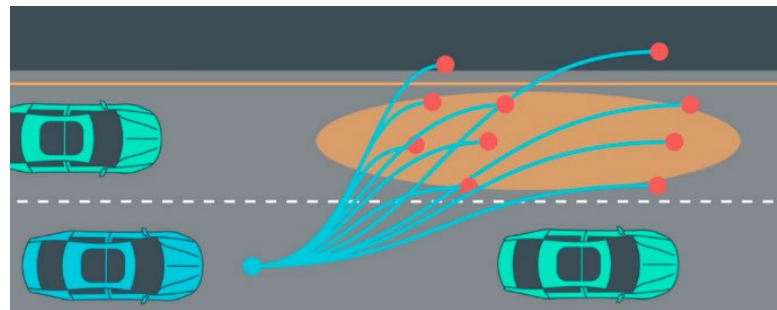
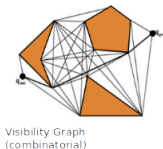
**Goal:** Find higher precision “good” (near optimal wrt cost function) path to execute

**Input:** Perception, Map, localization

**Output:** Planed reference path, Trajectory (with speed), Homotopy Space

## Common Tech Approach:

- Searching based Methods
- Stochastic Sampling Methods
- MPC

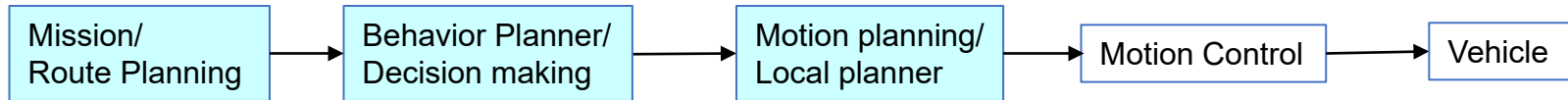




# Basic Planning Architecture

## 3 Tier Plan: Mission, Behavior, Local Planner (Common used in DARPA Urban Challenge 2007).

- Local Planner – Choose finer precision paths, actions to reach goal and avoid obstacles
- Behavioral Planner – Decision making to interact with others and follow rules (discrete choices)
- Mission Planner – Set high level goals, i.e., pick-up/drop-off tasks, route choice







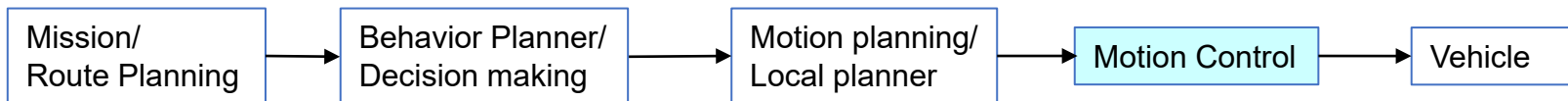
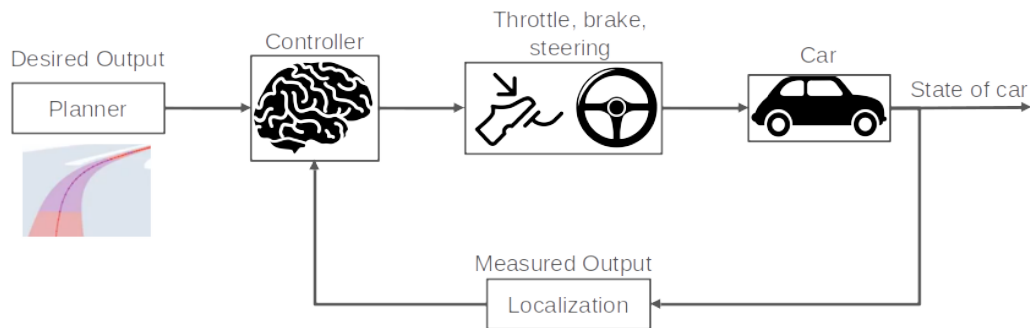
# Motion Control

**Goal:** Track the “best” Trajectory

**Input:** Planner, localization

**Output:** Steering, Throttle, Brake

**Common Tech Approach:** PID, Stanley, Pure pursuit, LQR, MPC



# **Course structure**



# Course Structure

Philosophy of course design

From developer point of view (low level to high level);

- a. How to control the vehicle;
  - b. How to generate an optimal trajectory;
  - c. How to generate a path
  - d. How to choose the best route
- Philosophy: from control to planning
  - a. Good control is the foundation;
  - b. Get better understanding of vehicle;



# Course Structure

Structure of this course: Control

- Model:
  - Vehicle Geometric model
  - Linear kinematic/dynamic vehicle model
  - Nonlinear bicycle vehicle model
- Control theory
  - Classical control theory
  - Modern control theory
- Actual Application
  - Cruise control; ACC (Adaptive cruise control); ABS(Anti-lock brake system)...
  - Trajectory tracking
  - Trajectory optimization



## Course Structure

Structure of this course: Planning

Introduce the problem first, then we will explain the basic theory. And how to use the algorithm to solve the actual problem.

**3 Tier Mission, Behavior, Local Planner** (Common used in DARPA Urban Challenge 2007).

- Local Planner – Choose finer precision paths, actions to reach goal and avoid obstacles
- Behavioral Planner – Decision making to interact with others and follow rules (discrete choices)
- Mission Planner – Set high level goals, i.e., pick-up/drop-off tasks, route choice



# Course Structure

Structure of this course: sessions

1. General architecture of autonomous vehicle planning control
2. Vehicle Longitudinal control
3. Vehicle Lateral Control based on Vehicle Geometric Model
4. Vehicle Lateral Control based on Linear Vehicle Dynamics Model
5. Vehicle motion control based on MPC
6. Local Motion Planning
7. Behavior planning
8. Mission Planning



# Course Structure

Structure of this course: Project

1. ACC design in Vehicle Longitudinal control
2. Trajectory Tracking by using Vehicle Geometric Model
3. Trajectory Tracking by using Linear Vehicle Dynamics Model
4. Trajectory Tracking by using nonlinear Vehicle Dynamics Mode + different method comparison
5. Path planning in the pre-defined scenarios
6. Route Planning in the pre-defined scenarios

Thanks for Listening!

