

# Overview Autonomous Vehicles

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# What is the problem?



**Driving is hard and wasteful.  
Transportation is expensive.**



# Human Drivers are the *Problem*

In the United States (2016)

- 7,277,000 reported crashes
- 3,144,000 people were injured
- 37,461 fatalities (1 fatality every 14 minutes)
  - Leading cause of death for ages 16-22
- 94% of all crashes are due to human error

***We should be working on this problem!***

# Why now? Why us?

- Sensing and actuation are (mostly) solved problems
  - Unlike many robotics tasks
- Limited by perception (alg.) and compute (arch./sys.)
  - Current research focus is on AI
    - Needed for advanced autonomy
    - AI needed for collision avoidance is partly ready
  - **Gap in research on systems side**
    - Needed: software and hardware platform of an autonomous vehicles
    - Keep device costs down while enabling innovation
- Challenges to entry
  - Data and test platform → simulation is improving + Berkeley test vehicles

# Basics of Autonomous Vehicles

# Levels of Autonomy: Automotive Engineering Society (AES) Standard

	Name	Description	Steering & Accel.	Env. Monitor	Fallback
1	Driver Assistance	Assistance for <b>either steering or acceleration</b> using information about env. with the expectation that human performs all remaining aspects.	Human + System	Human	Human
2	Partial Automation	<b>Assistance for both steering and acceleration</b> using information about env. with the expectation that human performs all remaining aspects.	System	Human	Human
3	Conditional Automation	Autonomous driving with the <b>expectation that human will respond to a request to intervene</b>	System	System	Human
4	High Automation	Autonomous driving with the <b>ability to take a safe action (e.g., pull over) if a human cannot intervene.</b>	System	System	System
5	Full Automation	Autonomous driving <b>under all feasible roadway and environmental conditions.</b>	System	System	System



# Advanced Driver Assistance Systems (ADAS) vs Autonomous Vehicles



## Level 1– Level 3 ADAS Systems

L1: Individual assistance functions

- Collision warning
- Pedestrian detection
- Automatic emergency braking
- Lane detection, lane assist
- Parking assist

L2: combining them

L3: vehicle takes over driving functions, but driver must be ready to take over



## Level 4 – Level 5 Autonomy

Levels of Full Autonomy

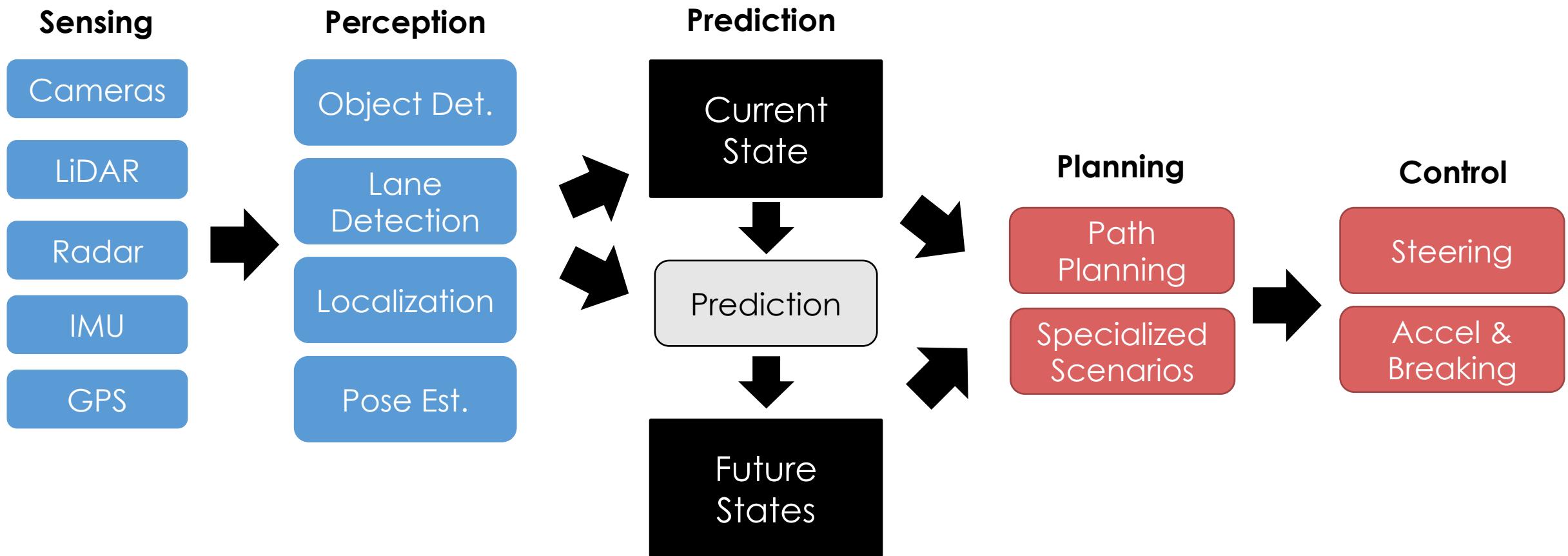
Level 4

- Full autonomy in constrained situations

Level 5

- Fully autonomous in all situations

# Cartoon Autonomous Vehicles Pipeline



Berkeley DeepDrive

### Rearward Looking Side Cameras

Max distance 100m

### Wide Forward Camera

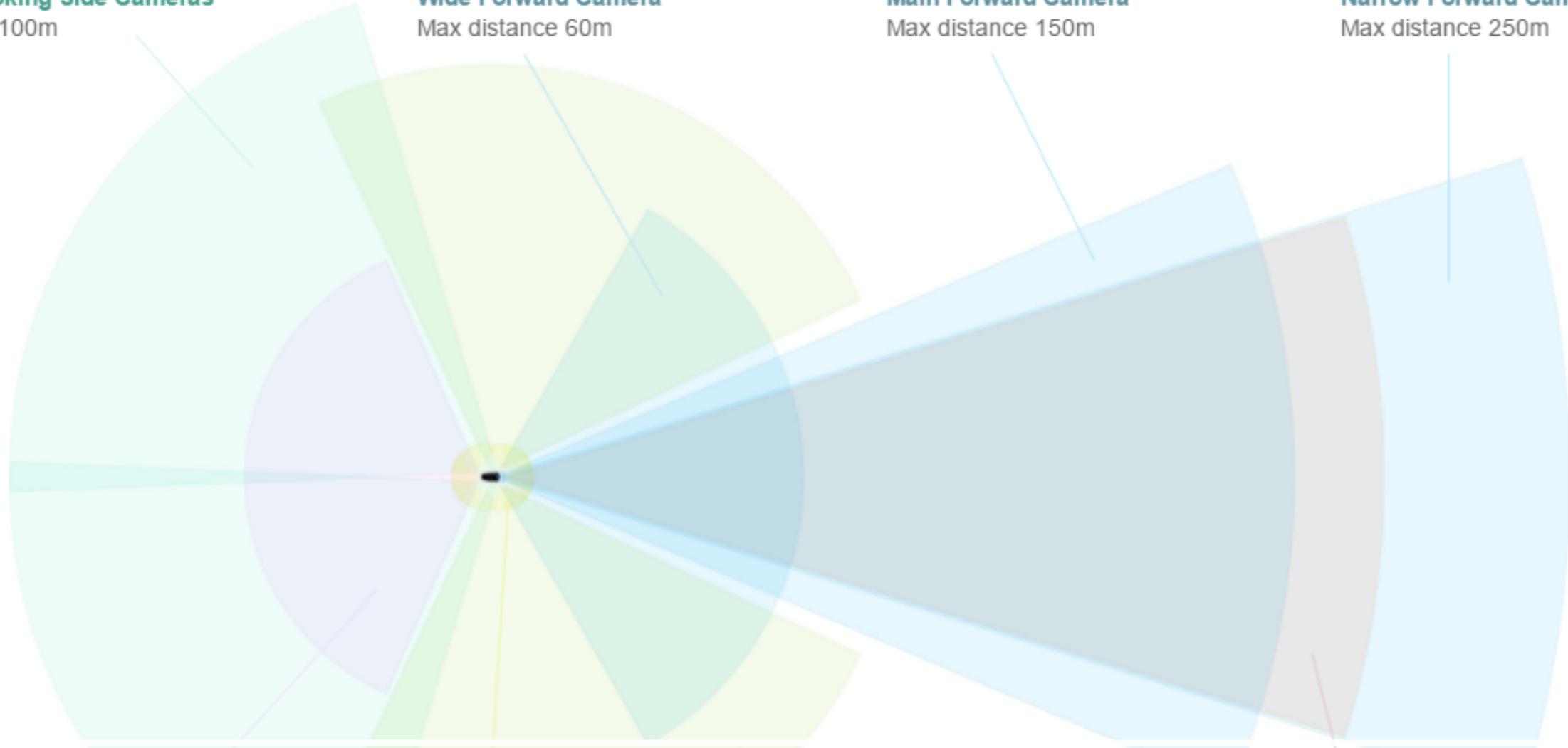
Max distance 60m

### Main Forward Camera

Max distance 150m

### Narrow Forward Camera

Max distance 250m



# Tesla Sensor Package

### Rear View Camera

Max distance 50m

### Ultrasonics

Max distance 8m

### Forward Looking Side Cameras

Max distance 80m

### Radar

Max distance 160m



# Sensors – Top View

360° LiDAR

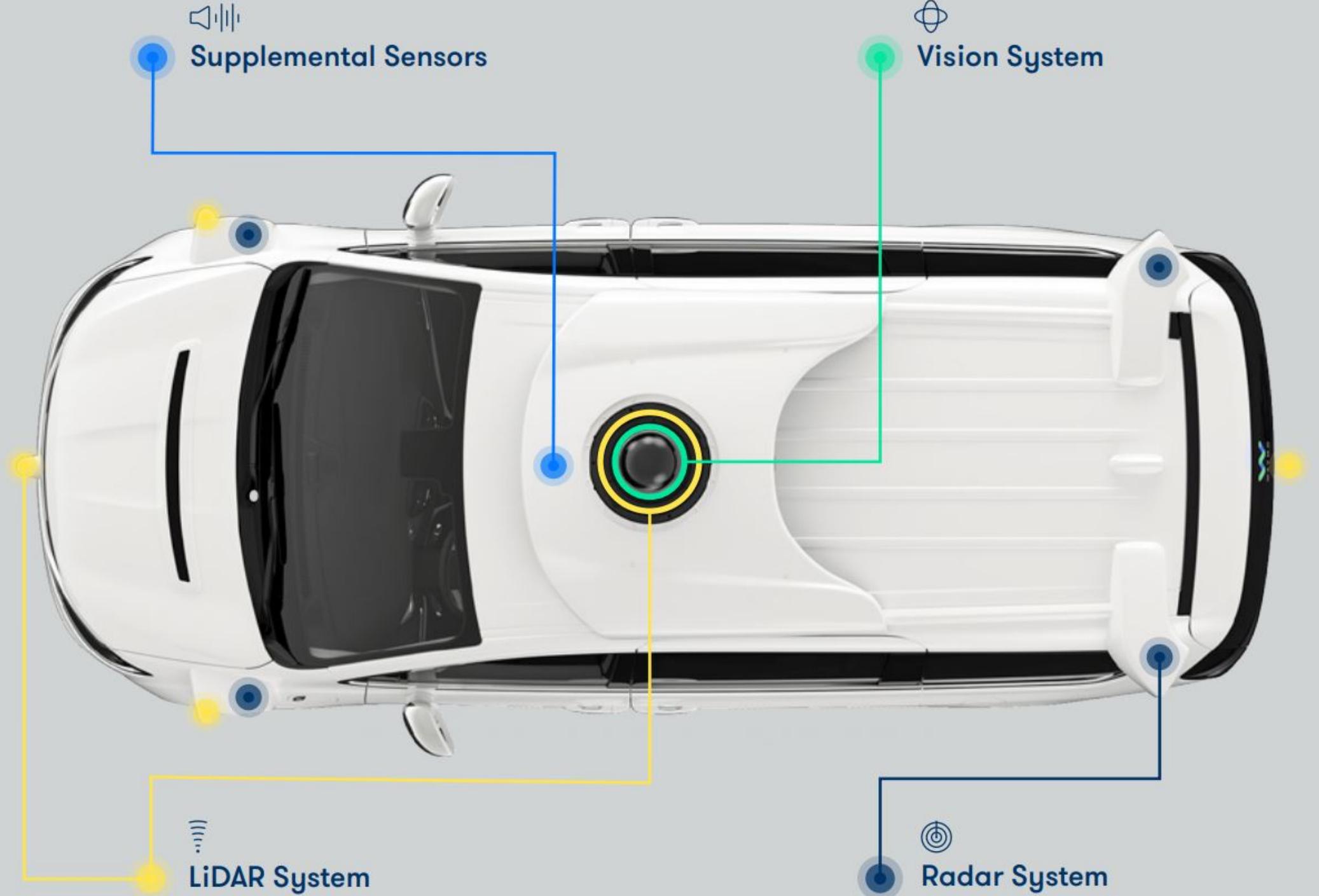


Stereo camera pairs

Camera array

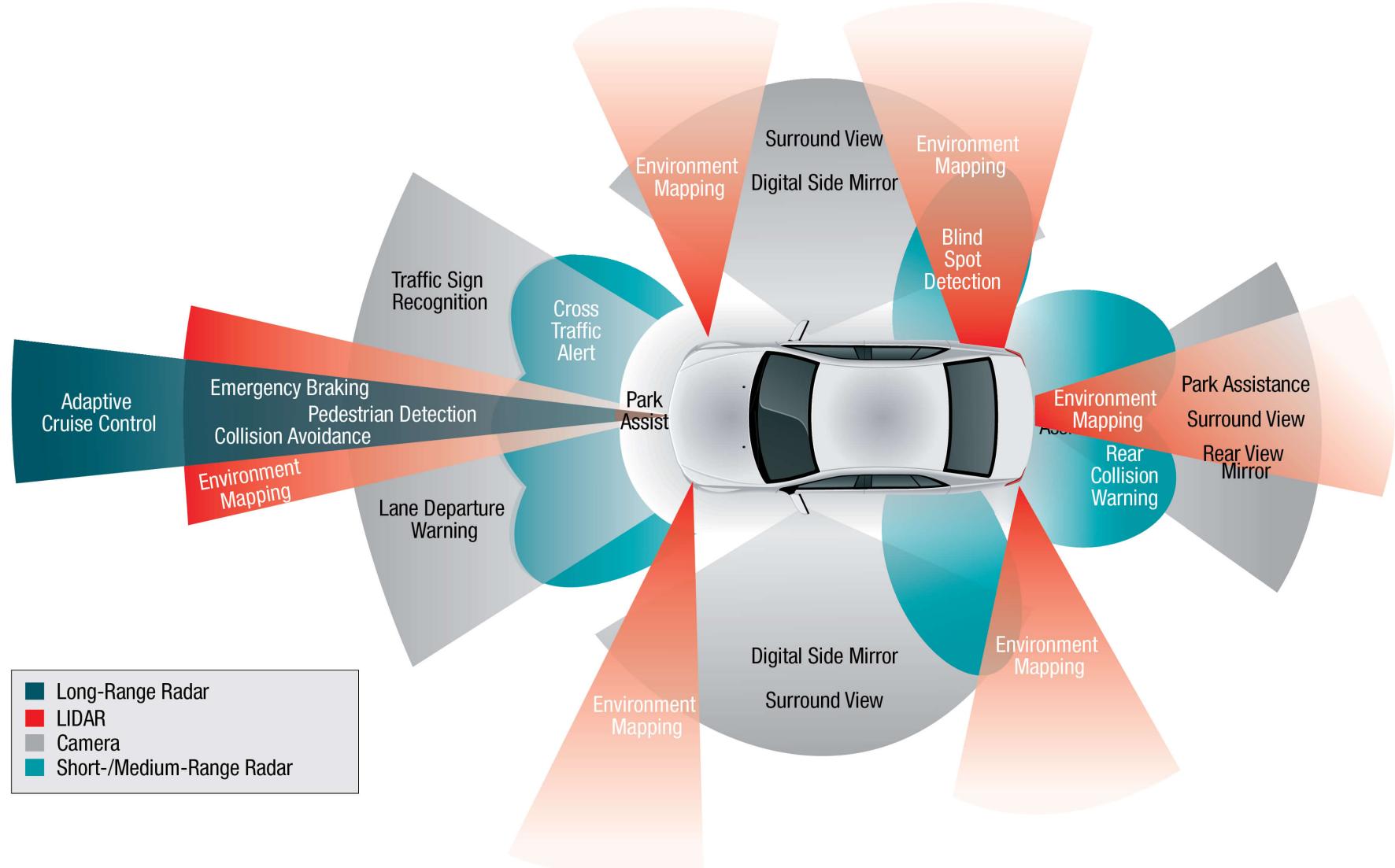
LiDAR & Radar

# Waymo





# Sensors and Their Uses



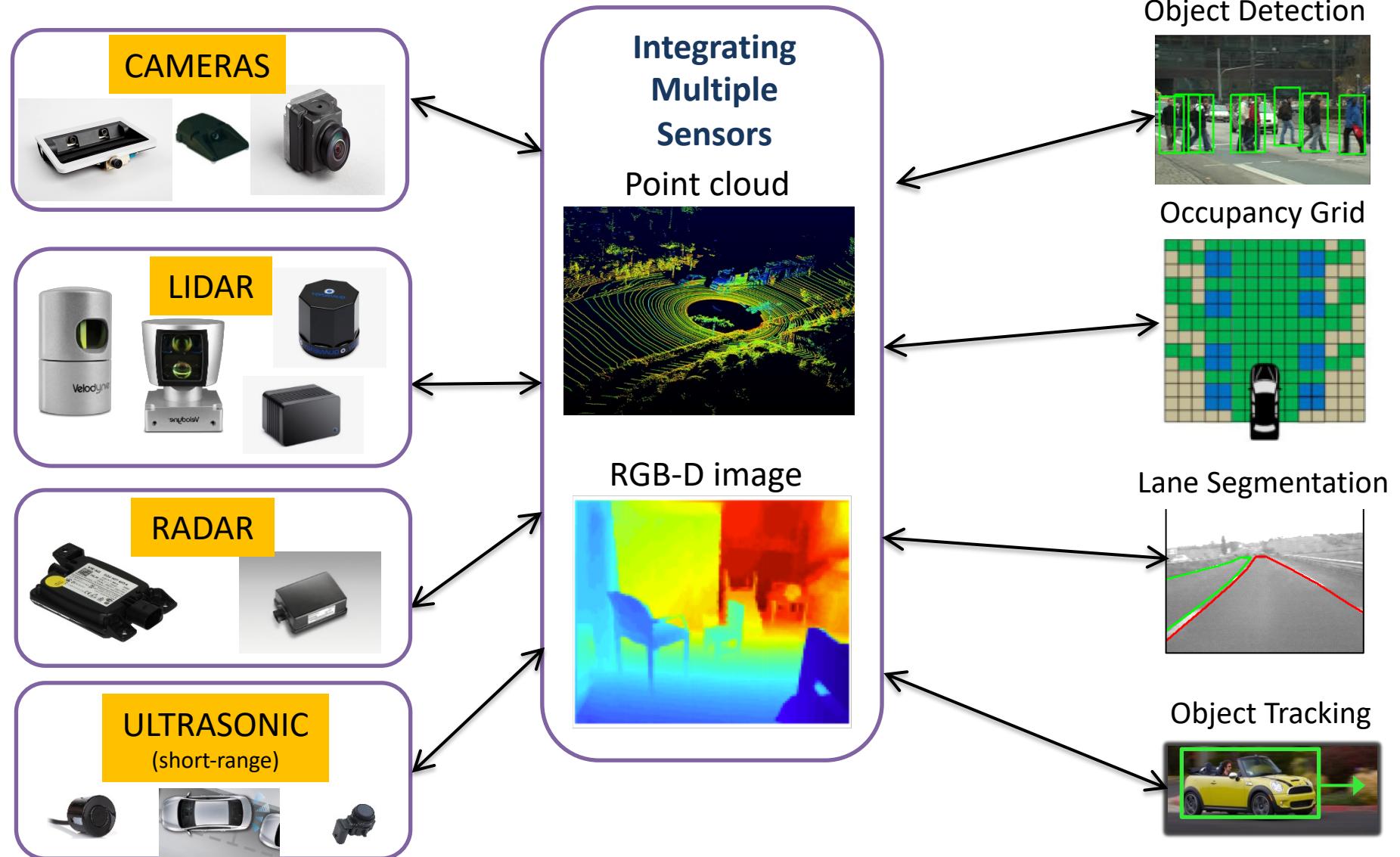


# Sensor Comparison

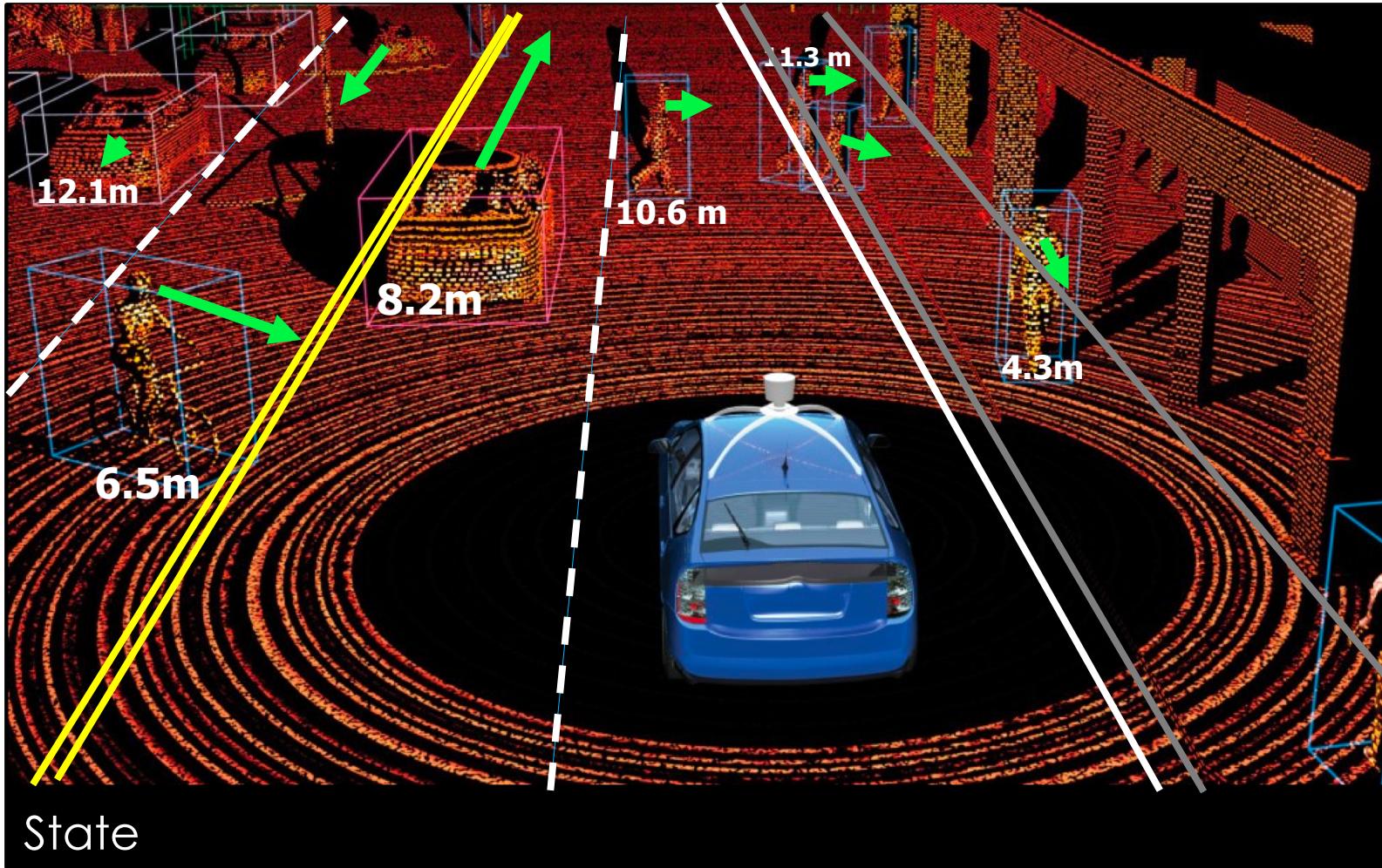
Sensor	Relative Cost	Resolution	Strengths	Weaknesses
LiDAR	Highest	Mid-range	Depth data 360° view	Susceptible to weather (fog, rain, snow etc.)
Camera	Least expensive	Highest	Traffic lights, pedestrians, signage	Darkness, glare, fog,
RADAR	Cheap	Low	Robust in bad weather	Low Resolution
SONAR	Cheap	Very low	Robust in weather, darkness, brightness	Very Short Range



# Applying DNN to Integrated Sensor Data



# Typical Approach to State Representation



## Accurate 3D Models

- Individual object detection, localization, and pose estimation
- High-resolution maps
- Object trajectories



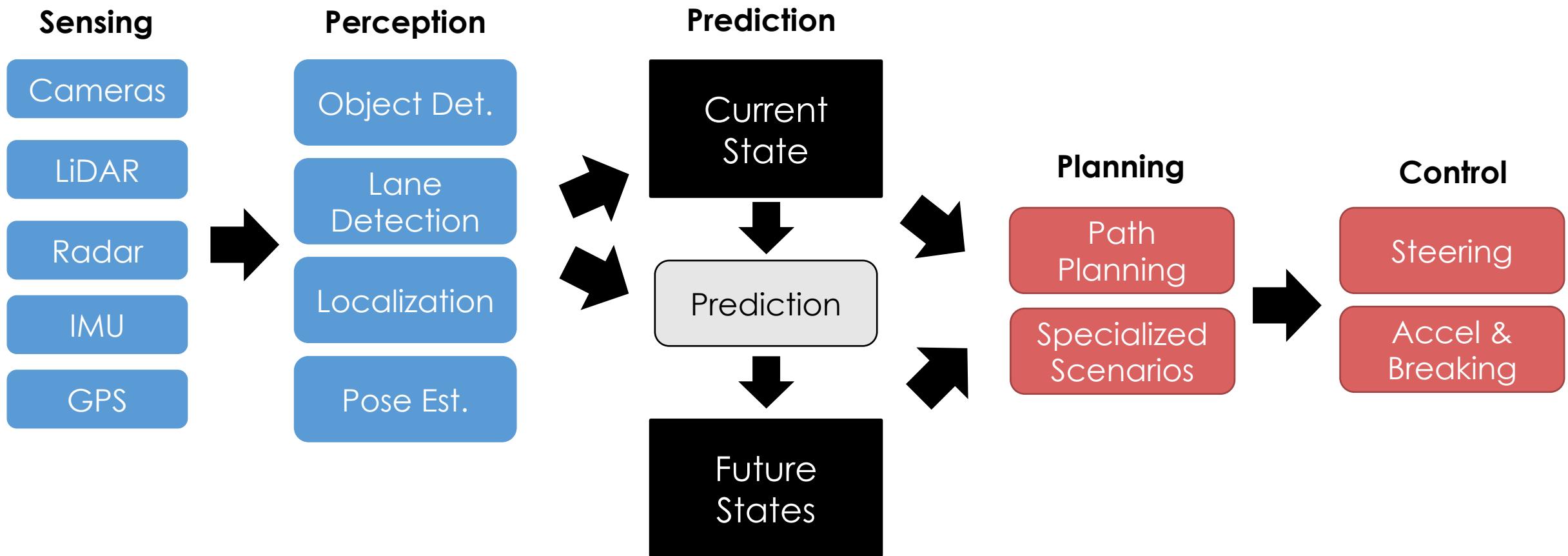
Berkeley DeepDrive



Waymo

Waymo

# Cartoon Autonomous Vehicles Pipeline

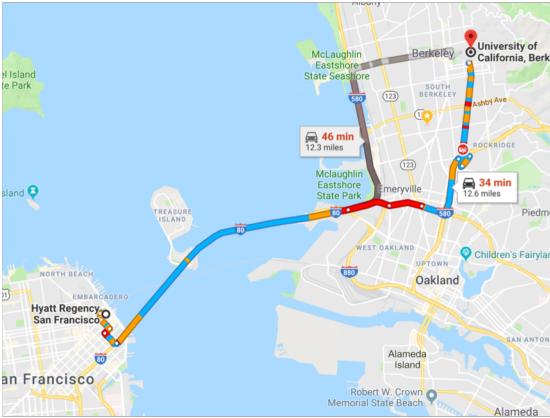


Berkeley DeepDrive

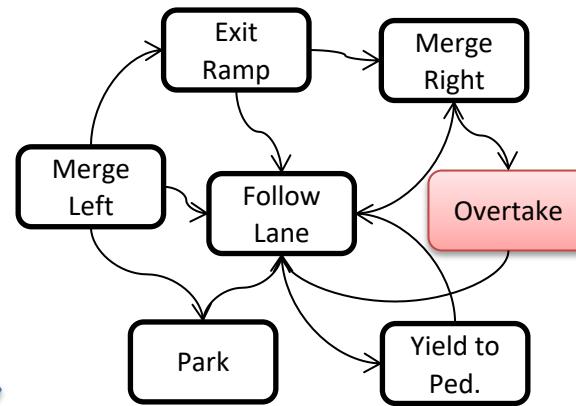


# Decompose motion planning and control into stages

## Route Planning



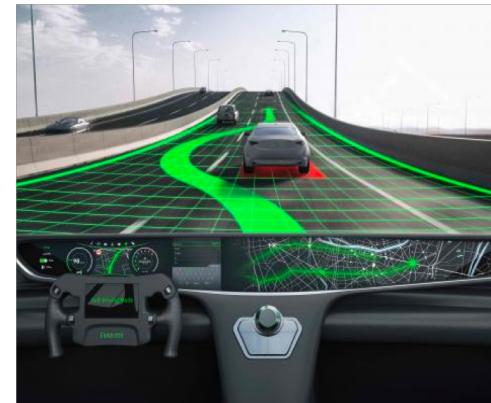
## Behavior Planning



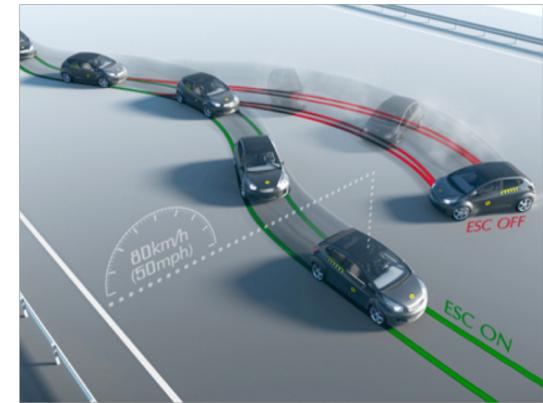
Sequence of roads and intersections

Road Networks  
Traffic Information  
Obstacles ...

## Path Planning



## Local Control



Detailed Path to Follow

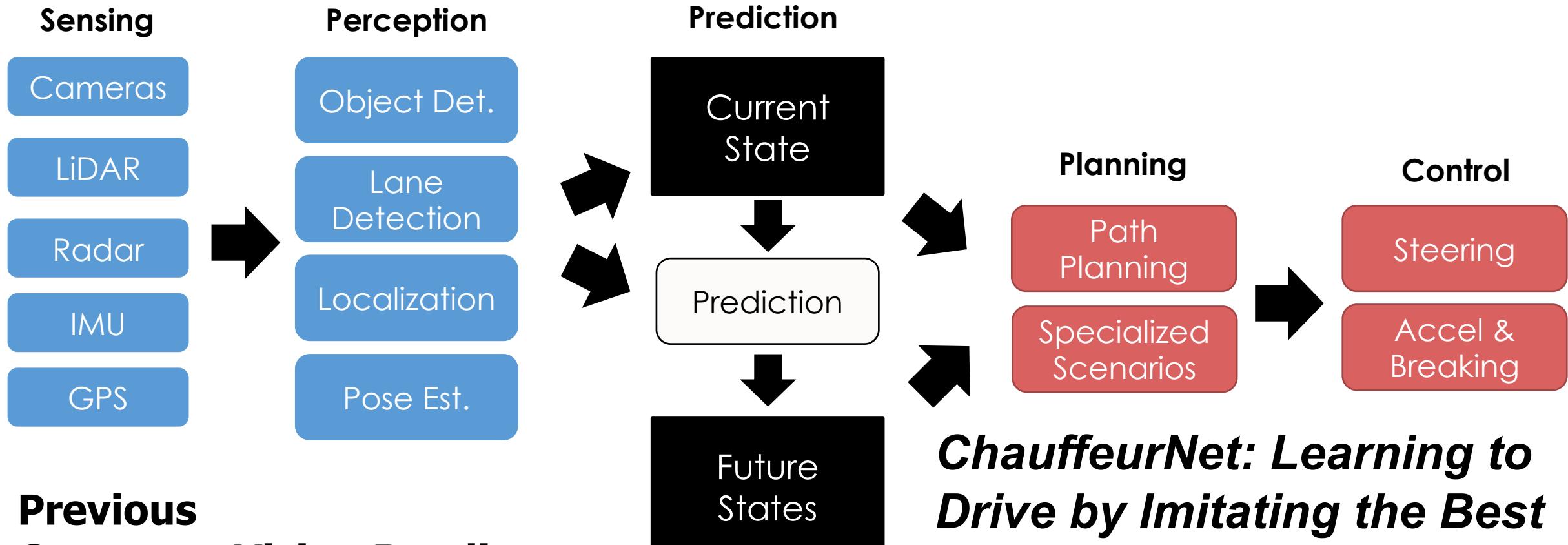


1. Model of the world around the car including predicted future states.
2. Model of the vehicle's dynamics.



# *The Architectural Implications of Autonomous Driving*

– Presented by Sukrit



**Previous  
Computer Vision Reading**

***ChauffeurNet: Learning to Drive by Imitating the Best and Synthesizing the Worst***

– Presented by Dequan