

Autonomous Vehicles

CPSC 470 – Artificial Intelligence
Brian Scassellati

Trust in self-driving cars may crash after Boeing

Quartz – 2 days ago

Autonomous cars tested against cyber-attacks

NBC News – yesterday

Uber's 250 autonomous cars have driven "millions" of miles and transported "tens of thousands" of passengers

Venture Beat - yesterday

Ford taps the breaks on the arrival of self-driving cars

WIRED – 3 days ago

Cambridge startup teaches driverless cars to behave around cyclists

Forbes - yesterday

Uber has spent more than \$1 billion on driverless cars

Bloomberg - yesterday

Waymo is gearing up to put many more self-driving cars on the road

TechCrunch - yesterday

New laser technology aims to make self-driving cars safer

CBS - yesterday



Timeline

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- 2004: DARPA Grand Challenge
- 2005: DARPA Grand Challenge
- 2007: DARPA Urban Challenge
- 2009: Google Self-Driving Car (SDC)

NavLab (CMU), 1985-2001



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5



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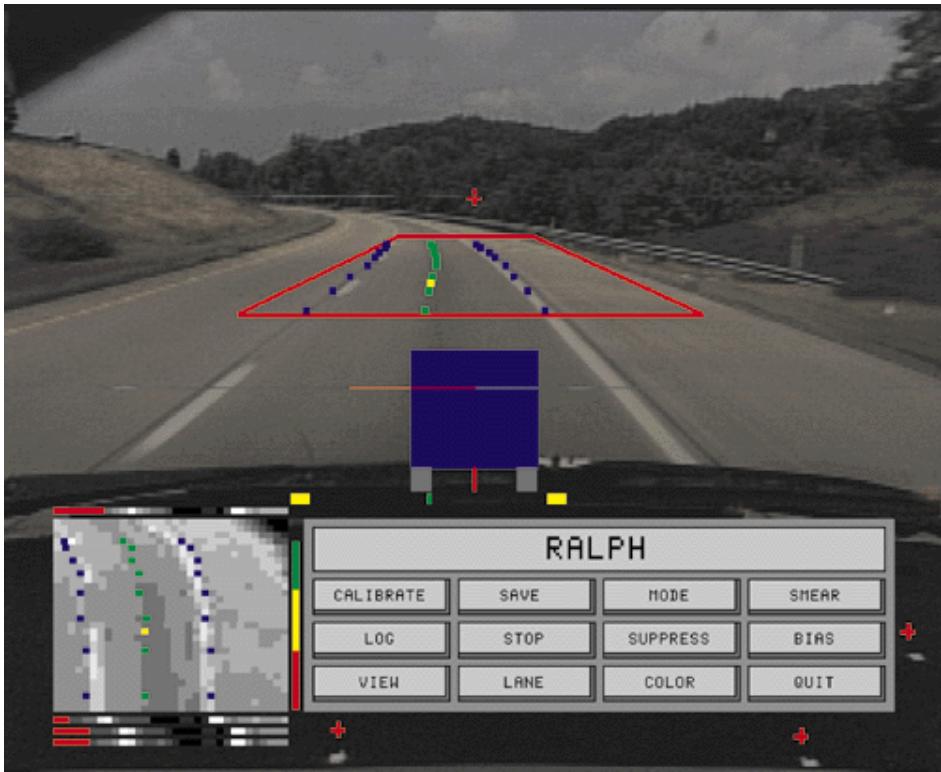


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10

“No Hands Across America”



- Dean Pomerleau and Todd Jochem (1996)
- Researchers handled throttle and break, steering was autonomous
- 2,850 miles from Washington, DC to San Diego using NAVLAB 5
- Autonomous operation for 98.1% (2,796/2,850 miles) of the trip

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Grand Challenge Course

Straight Roads



Mountain Roads



Cattle Guards



Open Lake



2004 Grand Challenge



Red Team Racing's Sandstorm

- 150 mile off-road race through the Mojave desert
- Natural and manmade hazards
- Autonomous
- \$1M prize
- 15 competitors qualified
- Best team only made it 7 miles
- Many hardware failures

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2005 Grand Challenge Winner: Stanford's Stanley

- 5 SICK laser range finders
- 2 radar sensors
- Color camera
- GPS, compass
- IMU



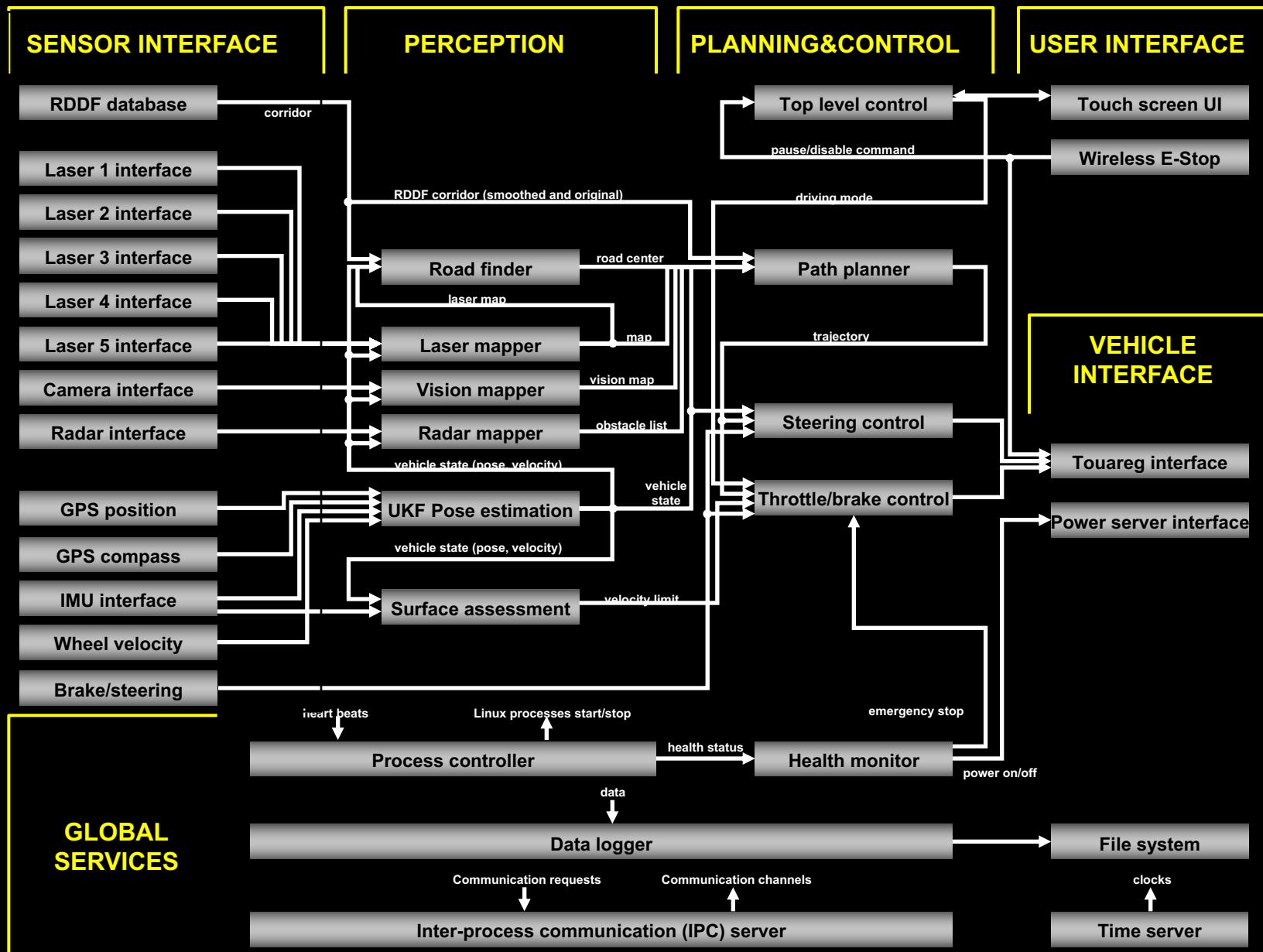
Key Concepts

- Recognition that this wasn't just a hardware problem

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 - Modular architecture was necessary for improvement.

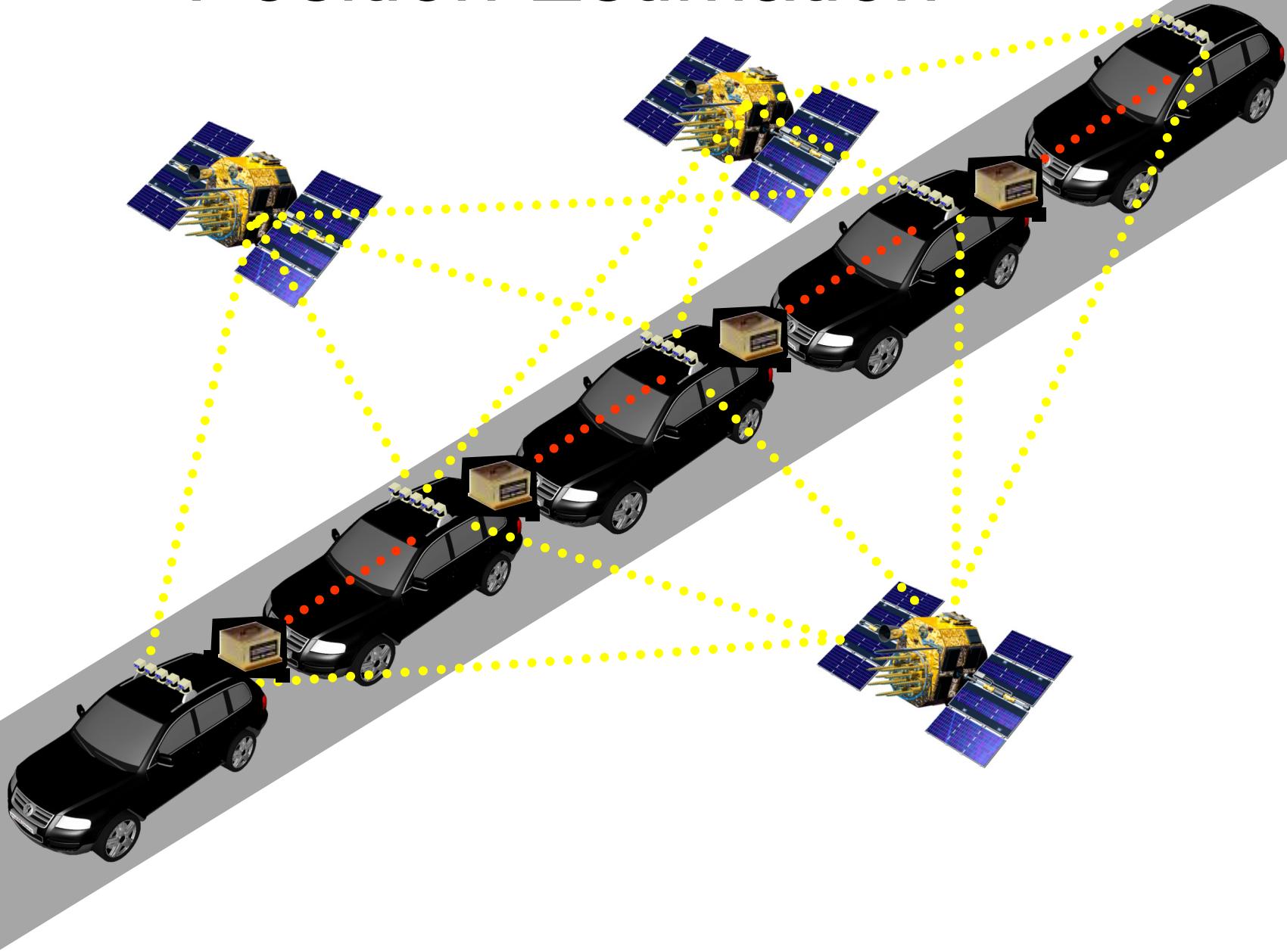
Stanley Software Architecture



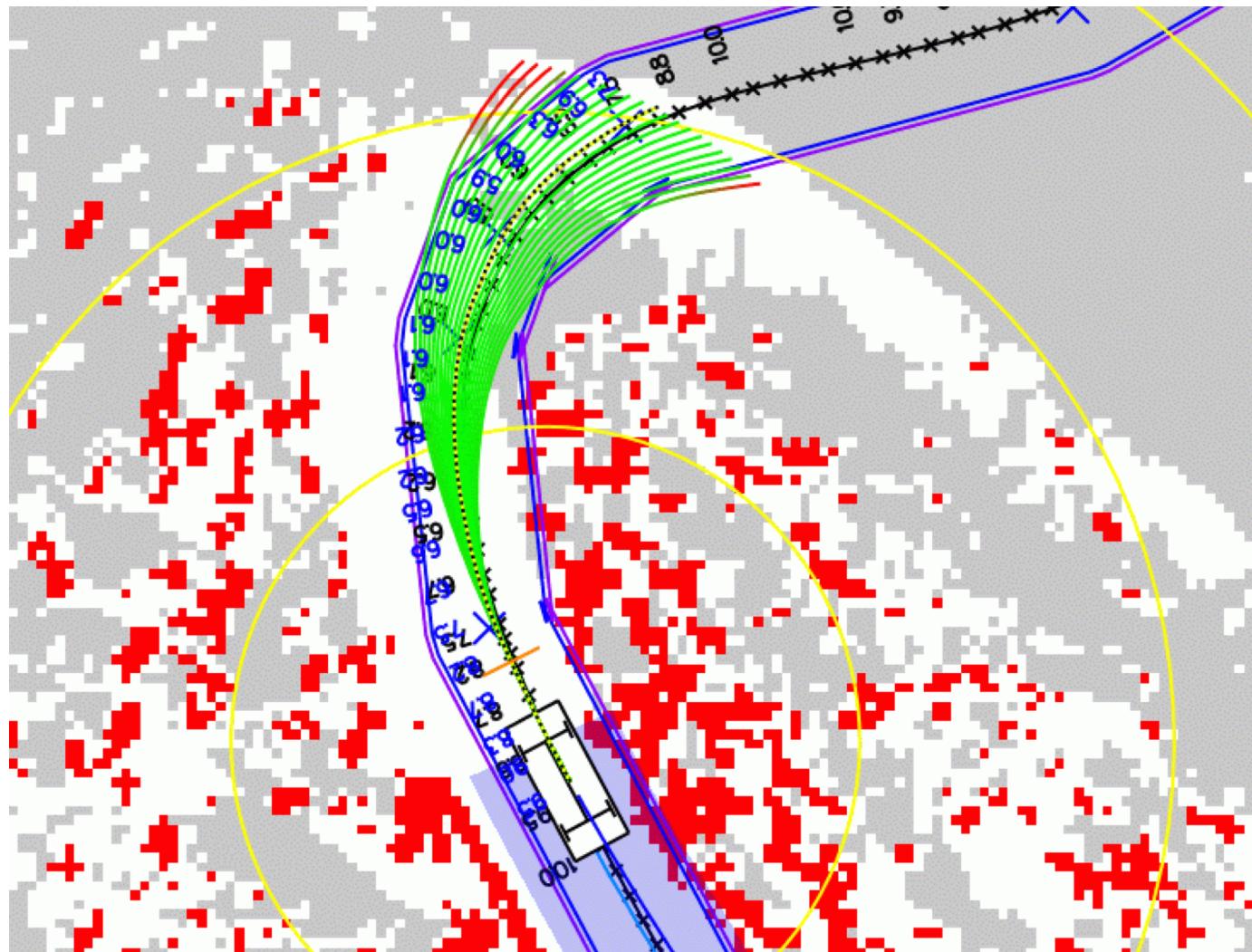
Key Concepts

- Recognition that this wasn't just a hardware problem
 - Modular architecture was necessary for improvement.
- More robust navigation
 - Multi-sensor approach to localization

Position Estimation



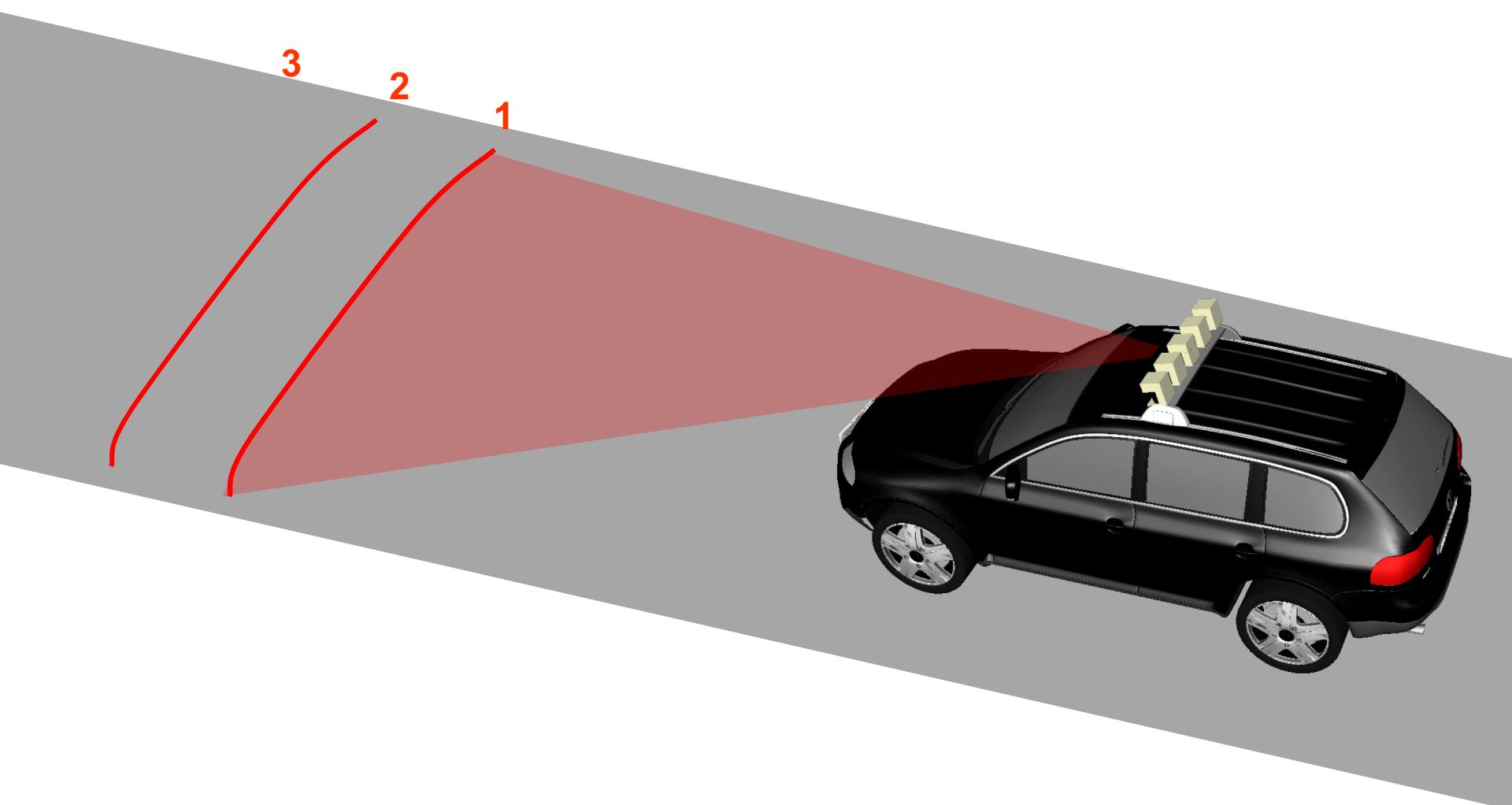
Planning = Rolling out Trajectories



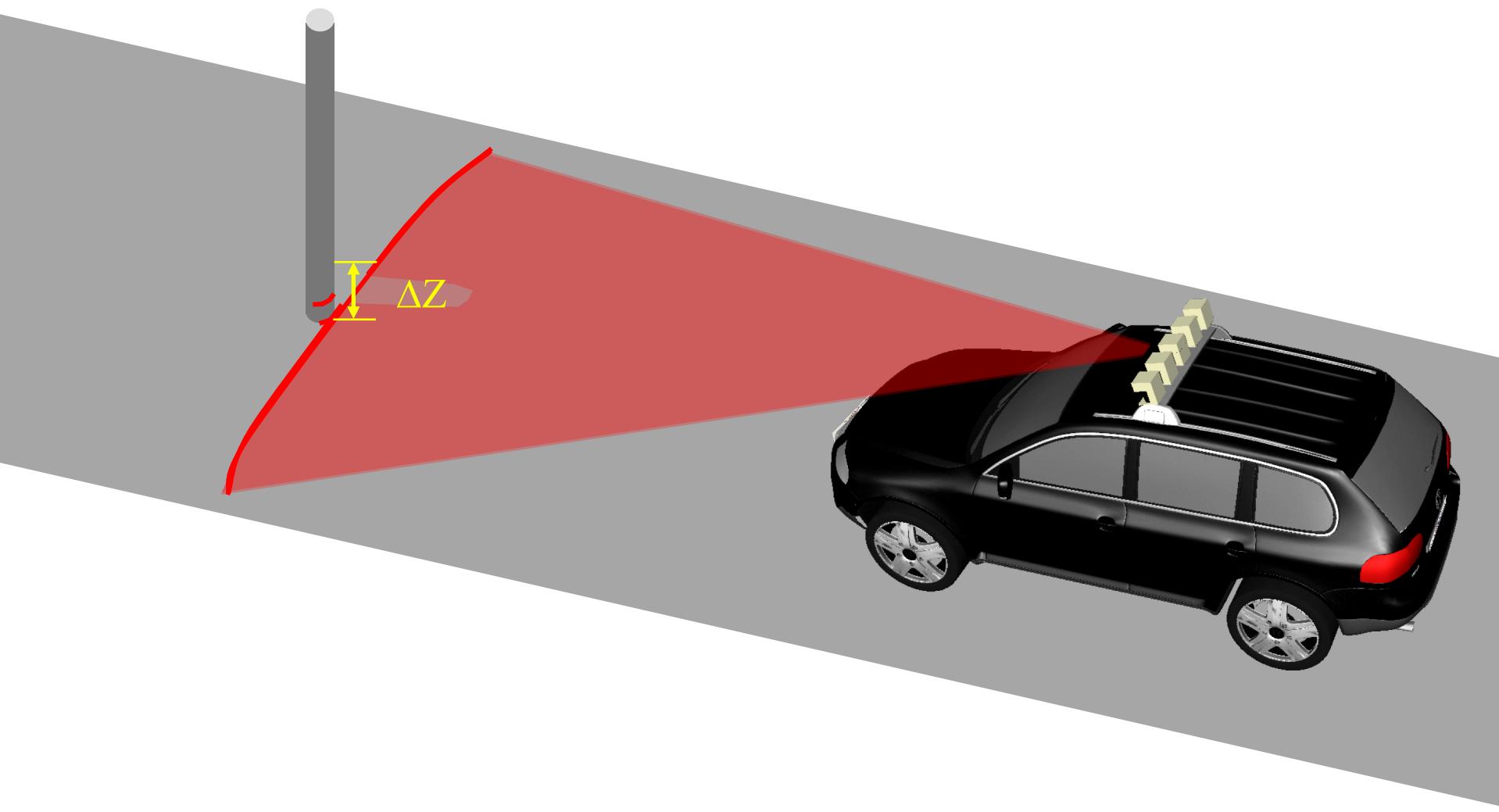
Laser Range Data Integration



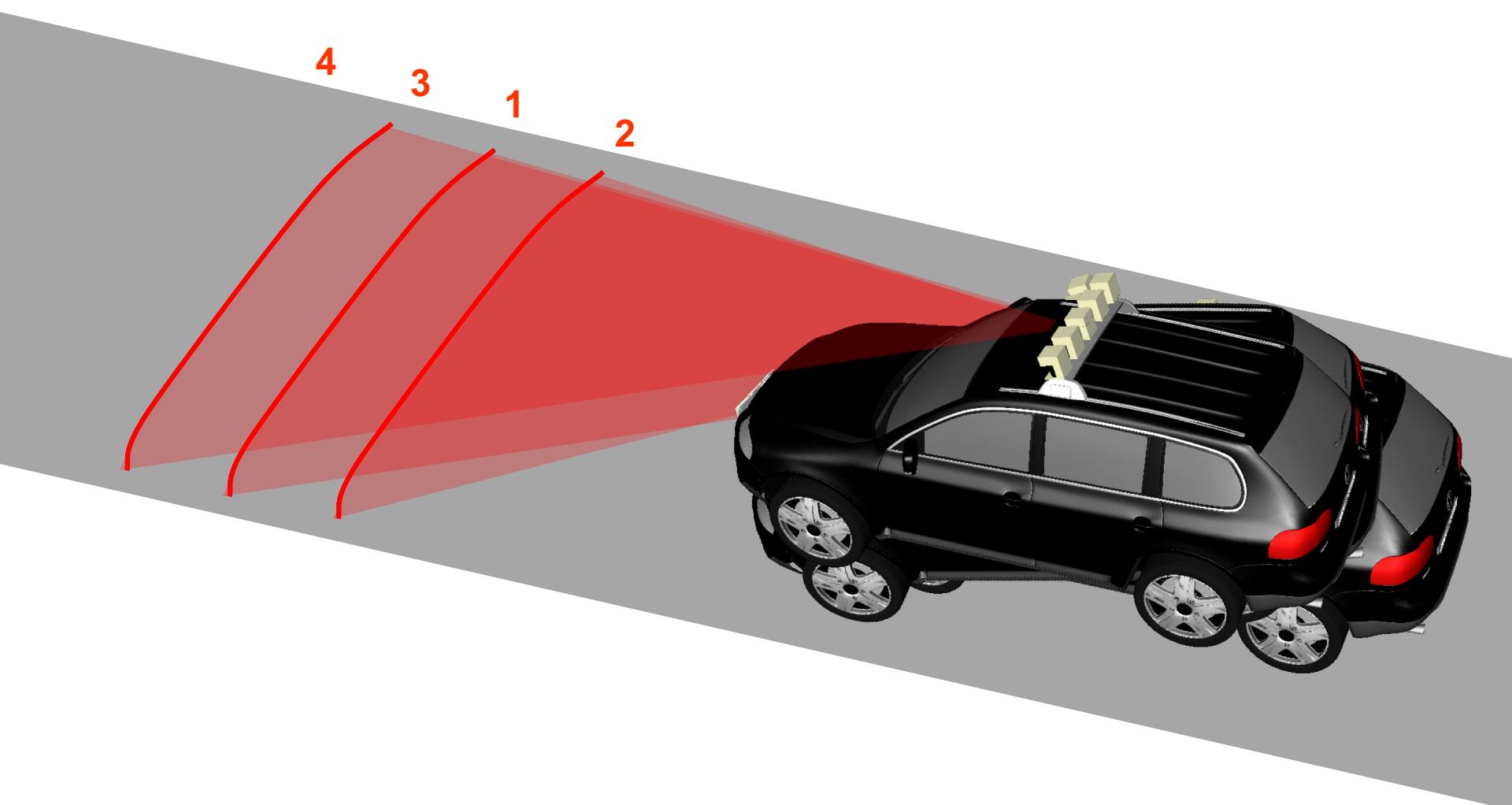
Range Sensor Interpretation



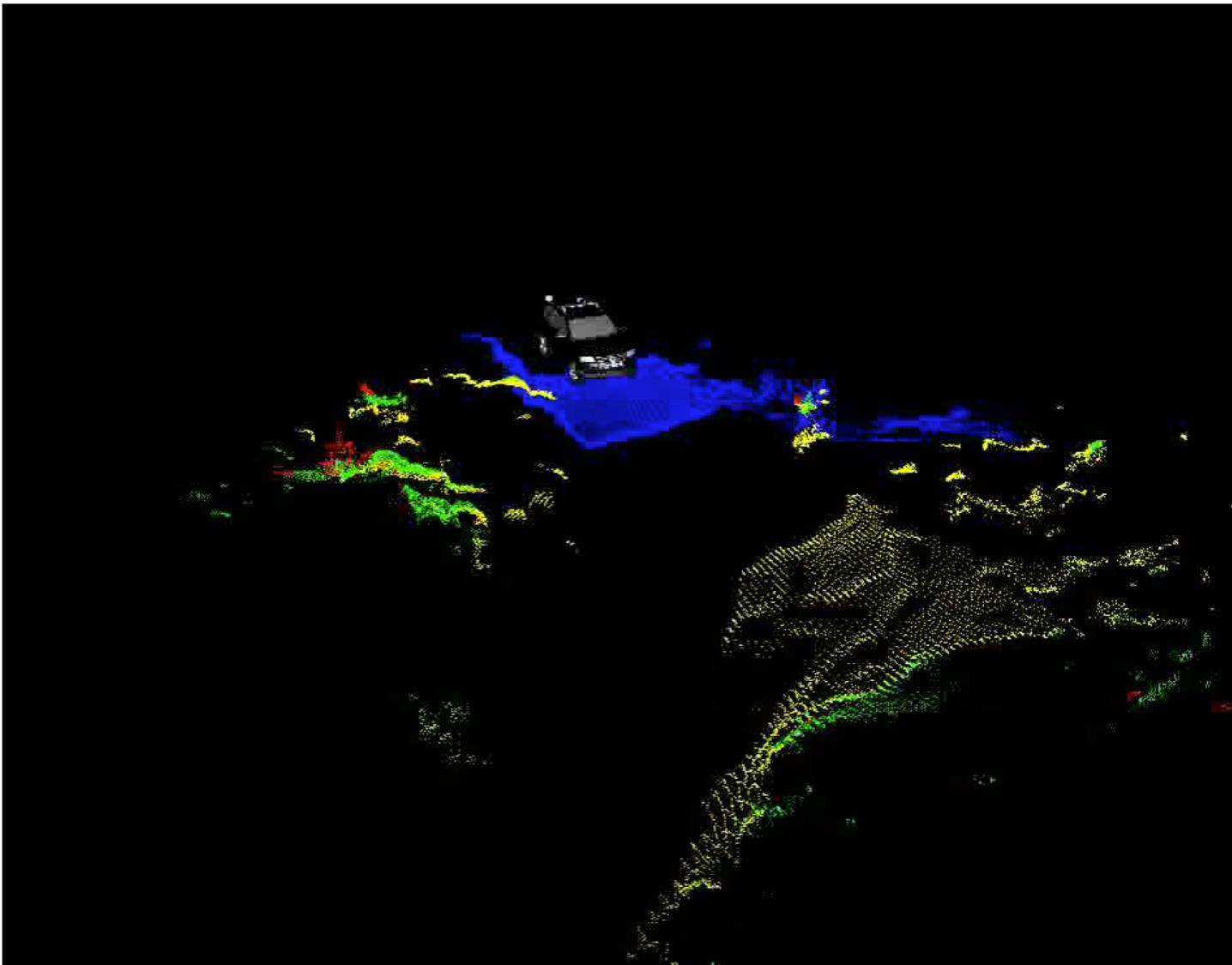
Obstacle Detection



Effect of Pitching



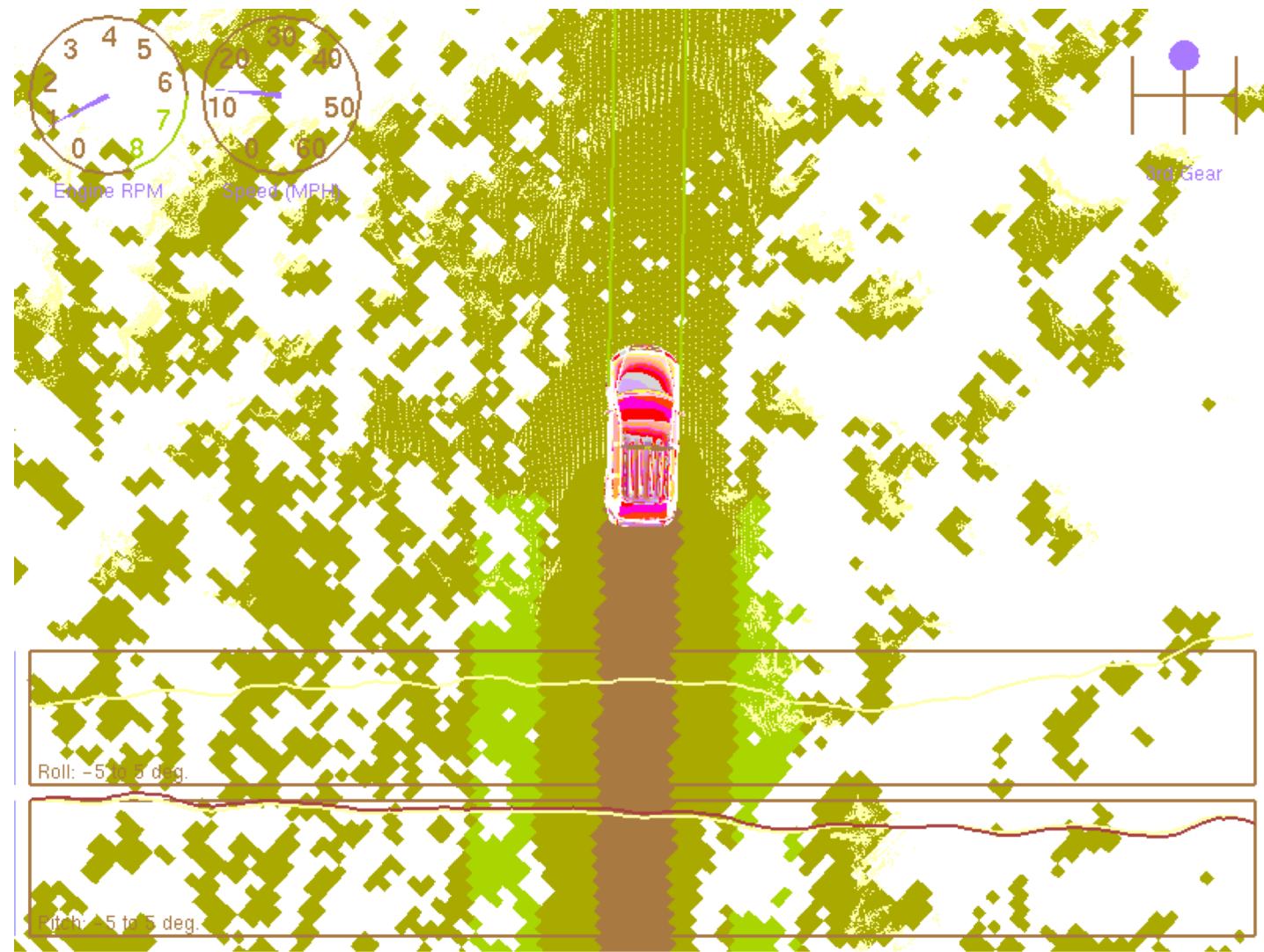
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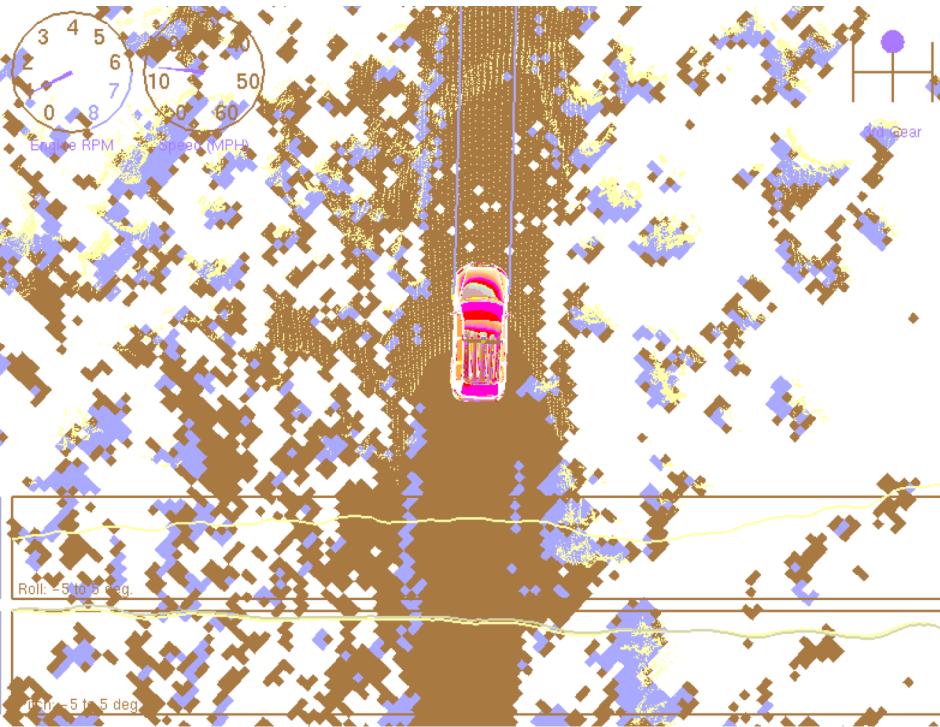
Key Concepts

- Recognition that this wasn't just a hardware problem
 - Modular architecture was necessary for improvement.
- More robust navigation
 - Multi-sensor approach to localization
 - Machine learning to remove false positives

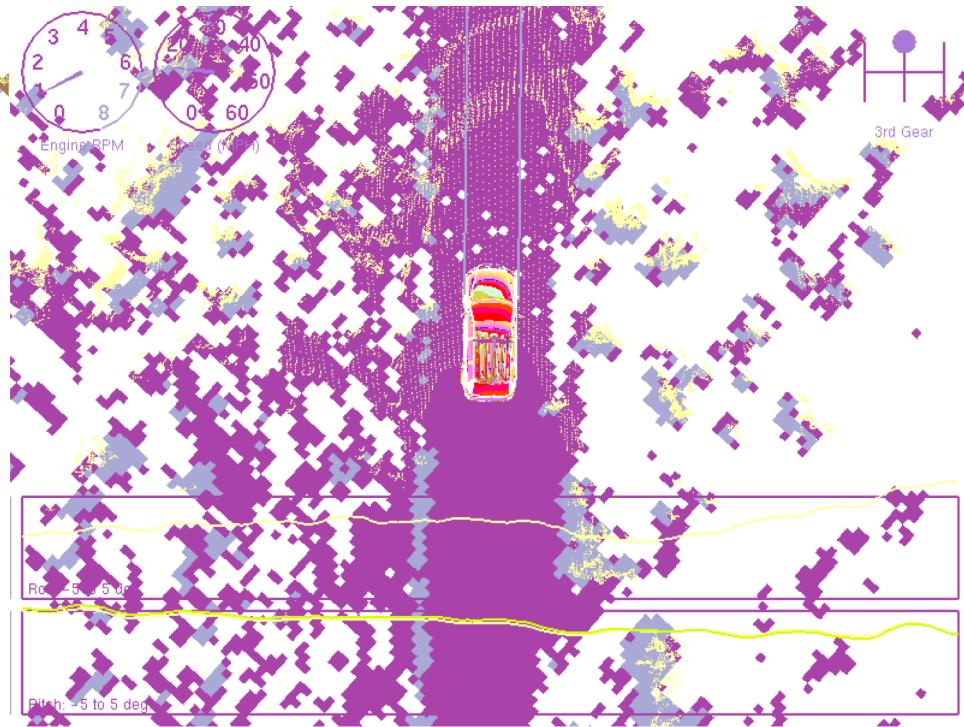
Training Stanley (Human Driving)



Stanley....After Learning



Without Learning: 12.6% false positives



With Learning: 0.02% false positives

Final Result: Five Robots finished!

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DARPA Urban Challenge



- 6 hours to complete 60 mile urban course
- New challenges:
 - Avoid other drivers, pedestrians, cyclists
 - Obey signs and traffic laws
 - Course unknown before day of race
 - Parking and u-turns

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Google Self-Driving Car

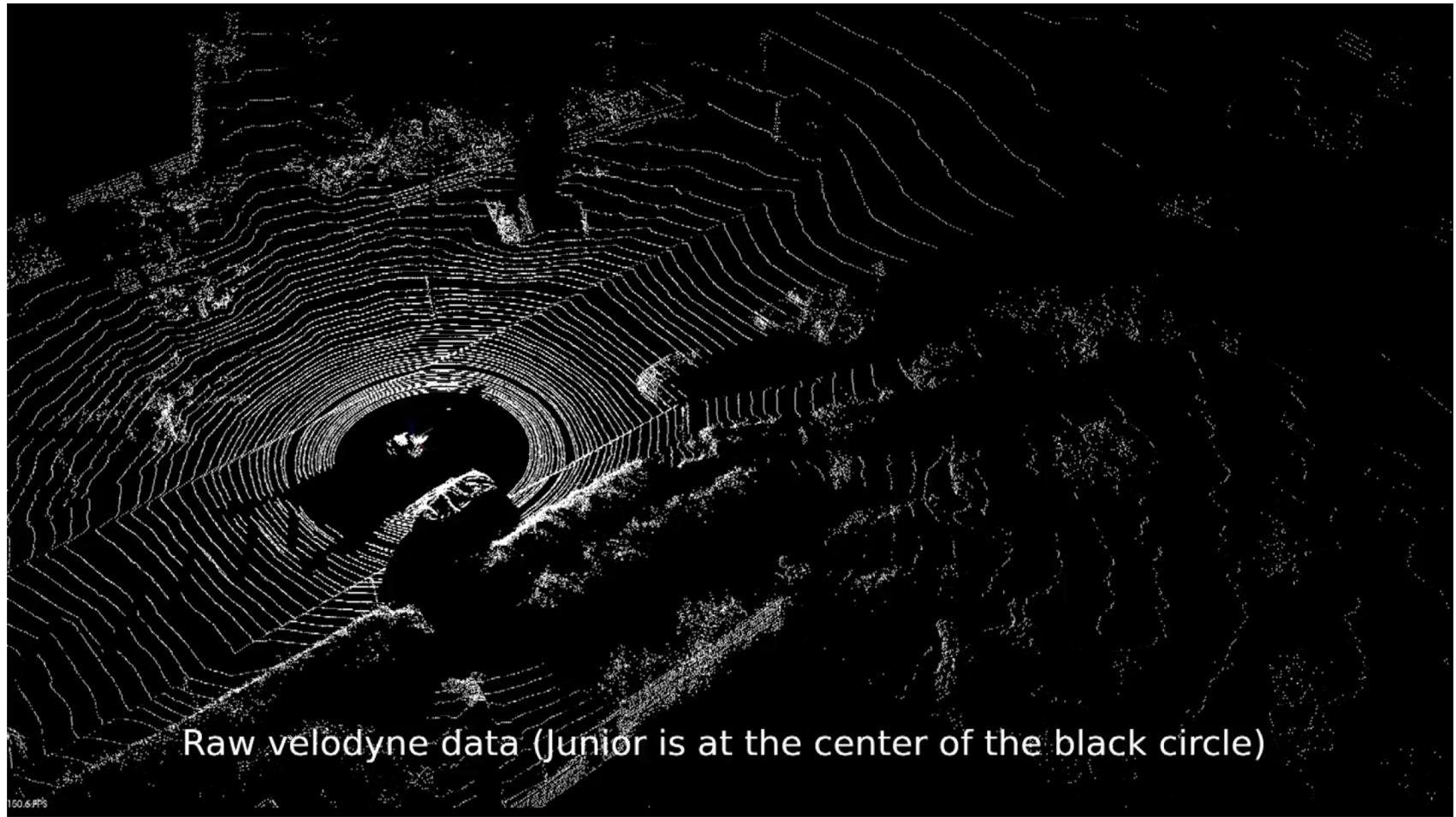


Velodyne LiDAR



2RT3D (August 26, 2009)

Velodyne LiDAR



Raw velodyne data (Junior is at the center of the black circle)

Brice Rebsamen (August 27, 2013)

Autonomous Vehicles Today

Policy and Regulation

The 5 levels of driving automation

For on-road vehicles



Human driver



Automated system

| | | Steering and acceleration/ deceleration | Monitoring of driving environment | Fallback when automation fails | Automated system is in control |
|--|--------------------------|--|-----------------------------------|--------------------------------|--------------------------------|
| | | Human driver monitors the road | | | |
| Automated driving system monitors the road | 0 NO AUTOMATION | | | | N/A |
| | 1 DRIVER ASSISTANCE | | | | SOME DRIVING MODES |
| | 2 PARTIAL AUTOMATION | | | | SOME DRIVING MODES |
| | 3 CONDITIONAL AUTOMATION | | | | SOME DRIVING MODES |
| | 4 HIGH AUTOMATION | | | | SOME DRIVING MODES |
| | 5 FULL AUTOMINATION | | | | |

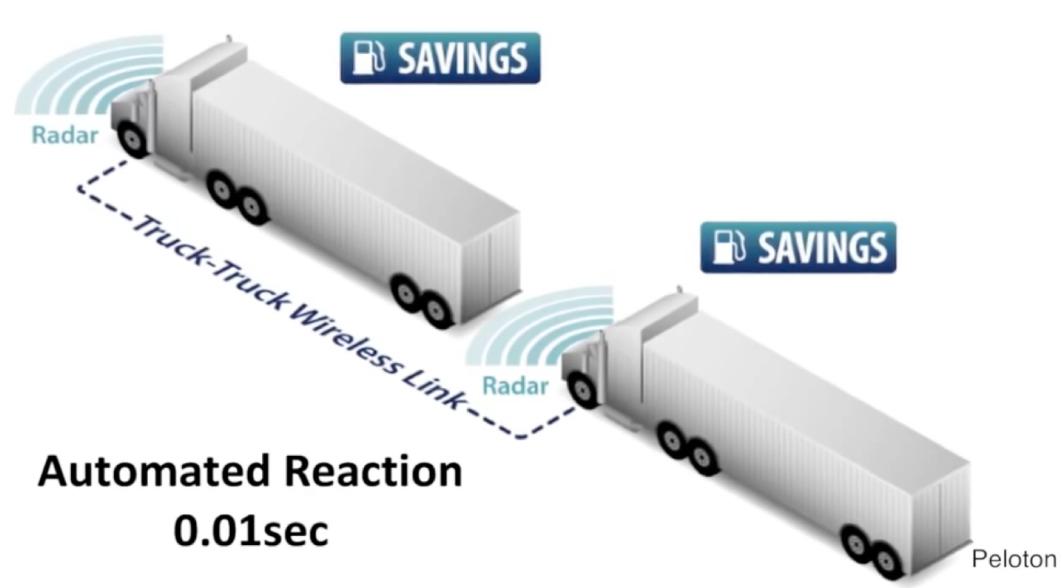
Enhanced Driver Support and Autonomy



Even Better Sensing



Job Loss

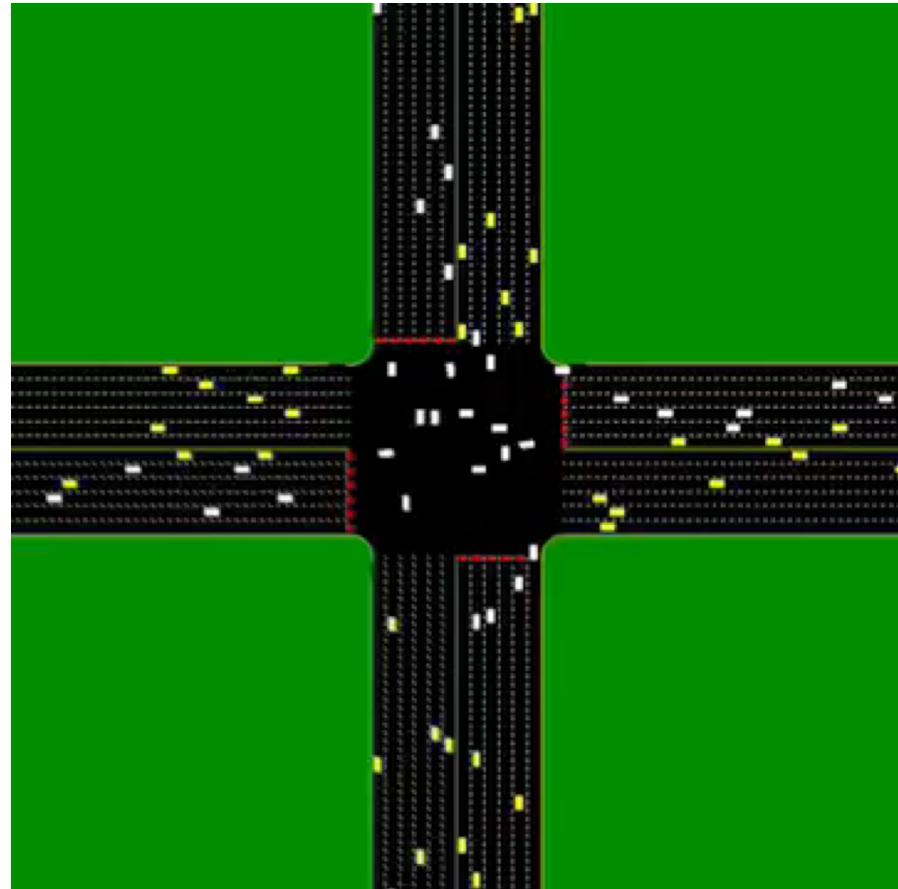


Beyond the Technology

Traffic and Congestion

- Traffic Accidents (USA)
 - 42,636 dead (2004)
 - 2,788,000 injured (2004)
 - Leading cause of death, age 3-33
- Commuting (USA)
 - 1.25 hours per day and working person

Can self-driving cars reduce accidents, limit pollution, eliminate road rage, and simplify community?



Autonomous intersection management
6 lanes, bi-directional traffic
Simulation by Peter Stone

Decision Making: Trolley Problems

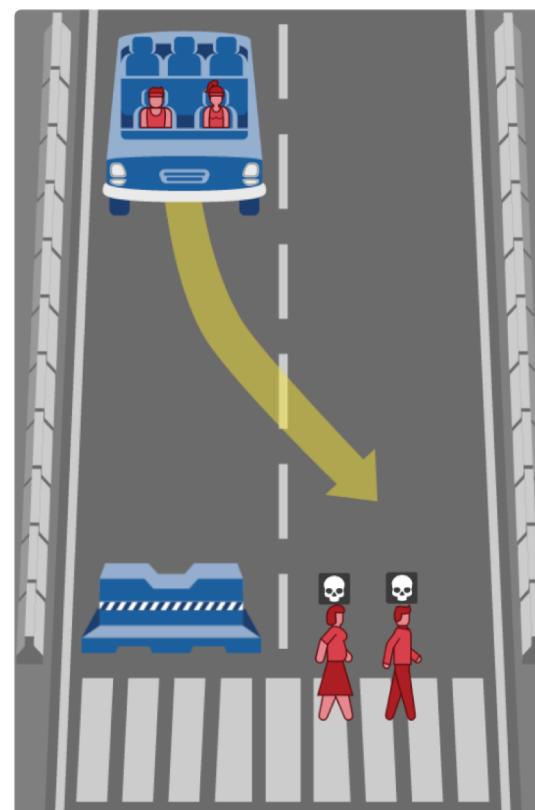
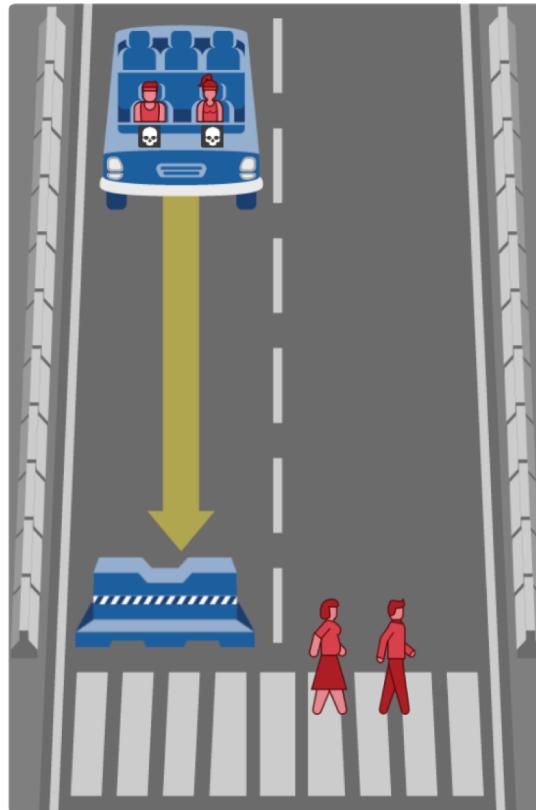
What should the self-driving car do?

1 / 13

In this case, the self-driving car with sudden brake failure will continue ahead and crash into a concrete barrier. This will result in ...

Dead:

- 1 female athlete
- 1 male athlete



In this case, the self-driving car with sudden brake failure will swerve and drive through a pedestrian crossing in the other lane. This will result in ...

Dead:

- 1 large woman
- 1 man

Topics to Discuss

- What does “safe” mean in this context?
 - How do we certify something as being safe?
- What impact will this technology have?
 - Infrastructure
 - Urban / suburban divide
 - Employment
 - Liability and insurance
 - Eldercare
 - Accessibility
- How does this change if we consider planes? Trains? Boats?
- Will the US be willing to give up driving?
- Can technology refuse to allow human control?

Administrivia

- Problem Set 7 out now on Canvas
- Next week
 - Robotics
 - Kinematics, dynamics, and control