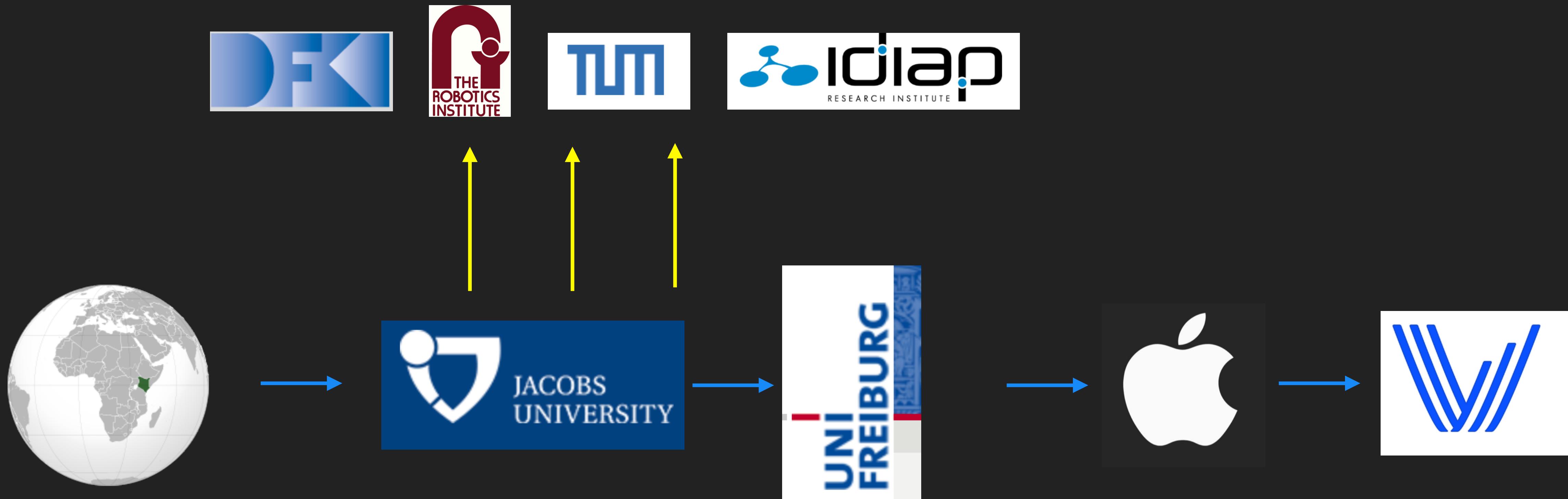


# Autonomous Driving Ecosystem: Challenges, Opportunities, Parallels



voyage

Billy Okal





## Voyage @DSA

Voyage's mission is to super-charge communities with self-driving cars. Our fleets power essential, everyday services designed to enhance each resident's quality of life. At Voyage, we strive to become a trusted member of every community we serve.

### It Starts with Communities

Voyage brings communities together with self-driving cars. We deliver a product that enables community members to summon an autonomous vehicle and move effortlessly from A to B.

## Llamas, Machine Learning and a Trip to Kenya

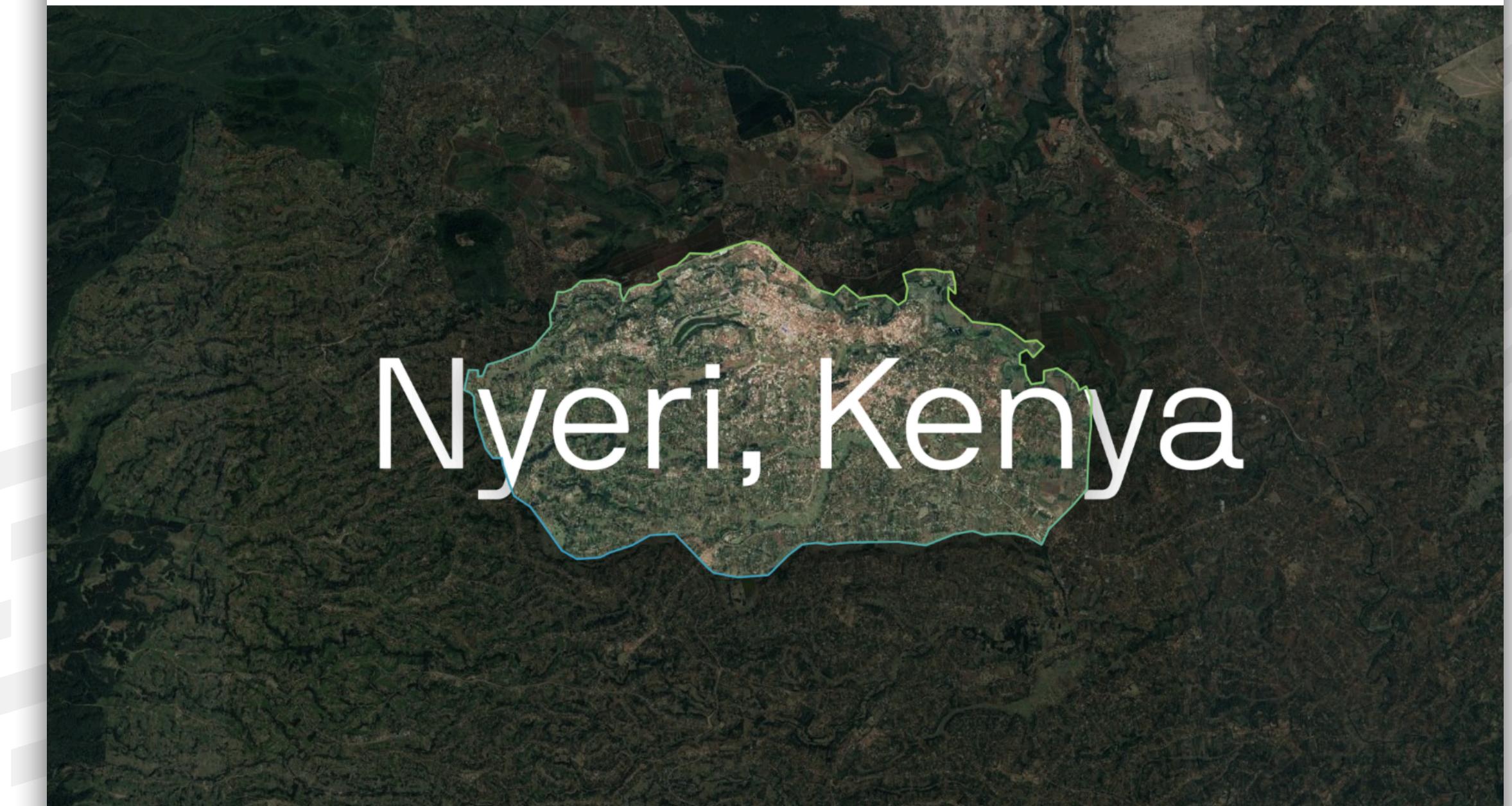
Sharing Voyage's learnings with new communities



Billy Okal



Jul 12, 2018 · 4 min read

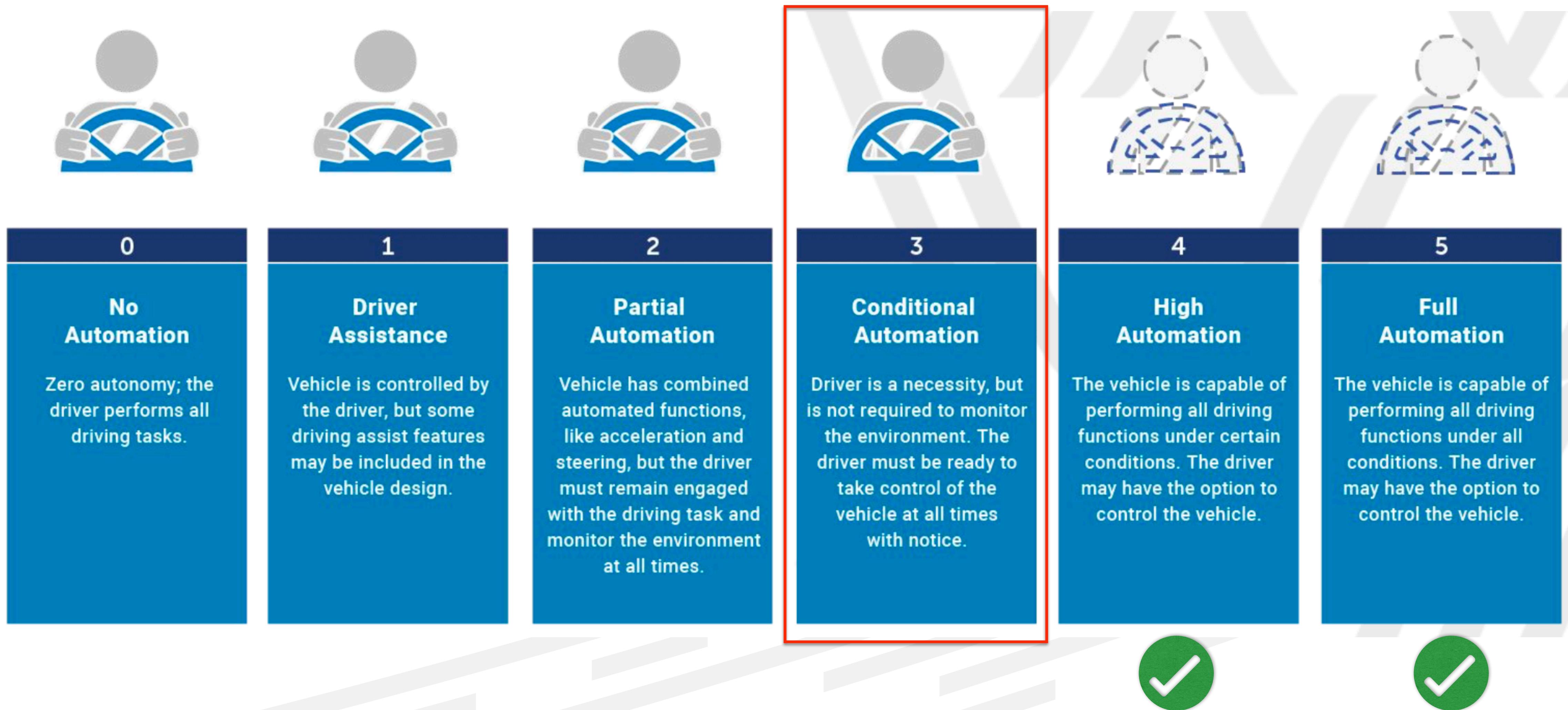


At Voyage, **communities are at the heart of what we do**. Our autonomous taxi service provides safe, accessible transportation to our amazing partner communities—and we learn something new each time a passenger gets in the



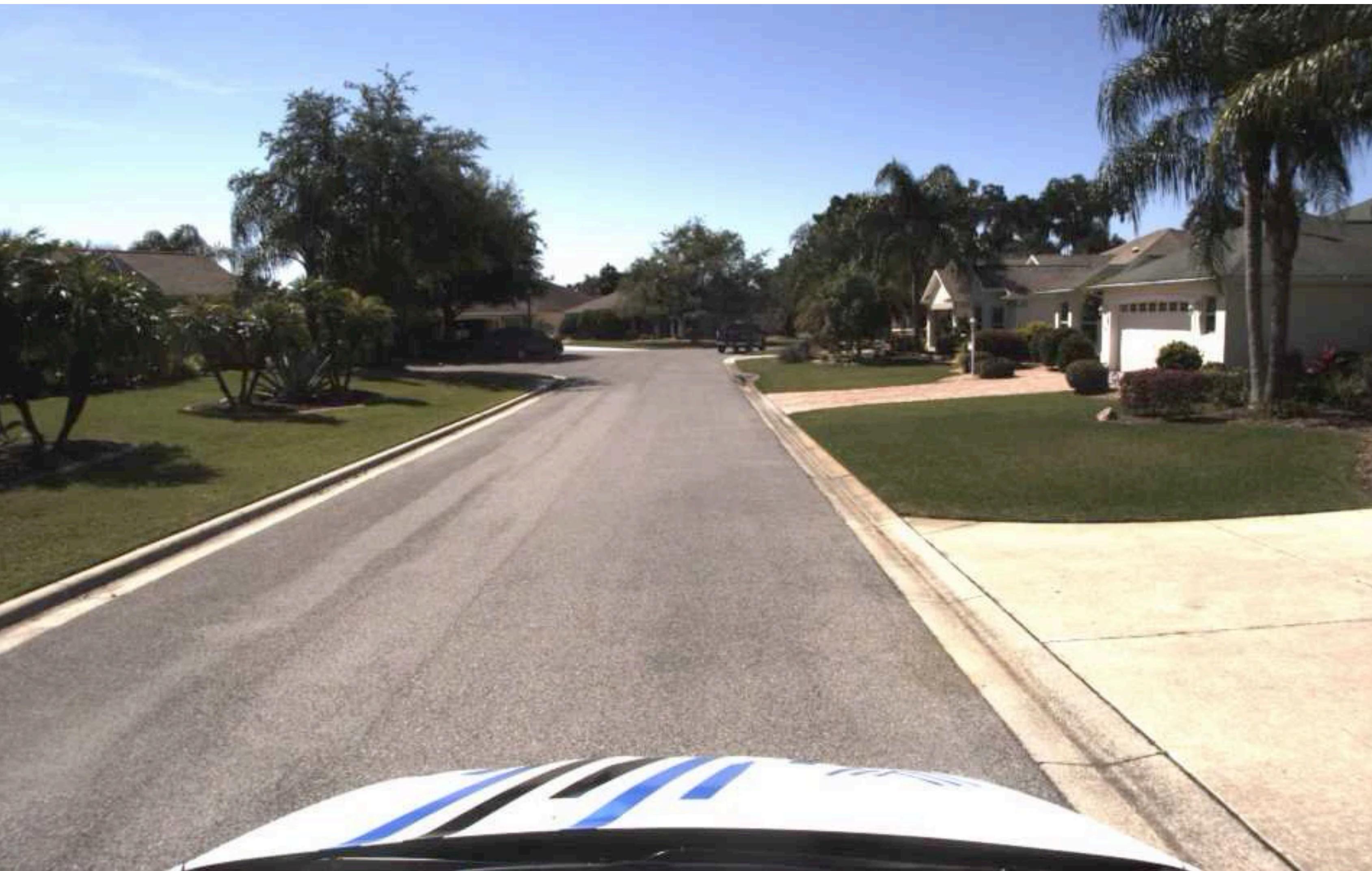
# What is Autonomous Driving?

# Classification of Driving Automation Levels





What can Level 4 do?





# Why Autonomous Driving?

# > 1.25 million

Deaths from road crashes each year, average of about 3287 per day [WHO]

Recognition errors (approx 40%)  
Decision errors (approx 35%)  
Performance errors (approx 10%)

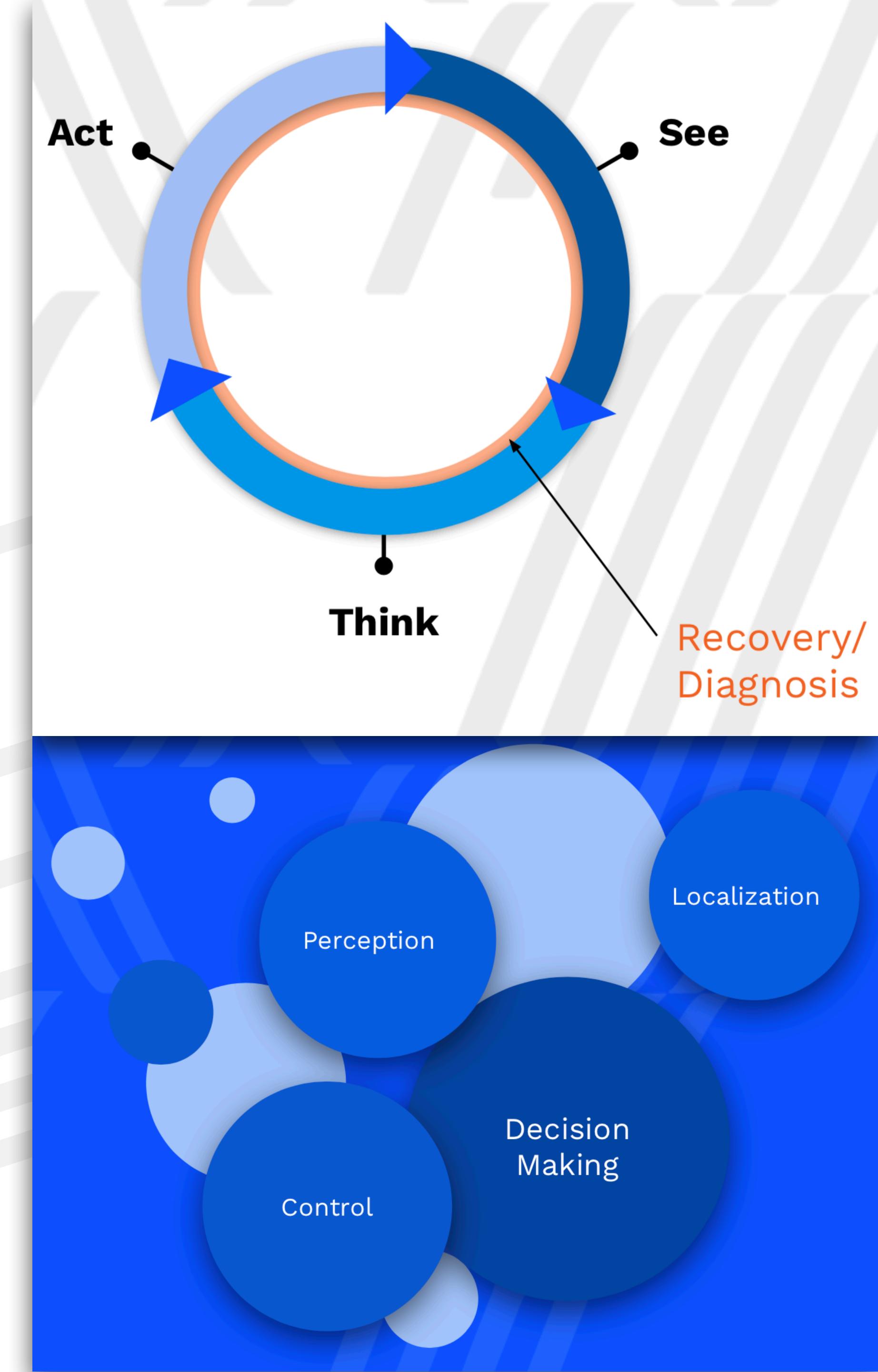
- **Accessibility**, especially for *vulnerable* society members
  - Older and younger population
  - People with disabilities and other mobility challenges
- **Efficiency**
  - Traffic (human and goods)
  - City planning, parking, vehicle ownership

- What does it take to achieve autonomous driving?
  - Key technologies involved
  - Challenges: what remains, how much further?
- Bring-ins
- Take-outs



## What does it take to develop AVs

- Core AV technology
  - See – object detection, classification, segmentation, tracking, localization
  - Think – route, behavior, motion planning, self-diagnosis
  - Act – tracking, control synthesis, system identification
- Hardware and services
  - Vehicle platform, compute, sensors
  - Data storage, on-board processing



- Additional AV dependencies
  - Maps, Routing, traffic control?
  - Teleoperation, remote monitoring
  - Fleet management (provisioning, maintenance, calibration)
  - HMI, Security, Verification, Certification
  - Simulation, Operating systems
  - Operations, field testing

- AVs are NOT isolated systems
- Multiple stages and paths of decisions
- Huge systems integration challenges
  - Algorithms, models
  - Software
- Design for the unexpected
- Have multiple redundancies — learning from mistakes in aviation, space flights





# AVs, Data Science & DSA

# Data Sizes in AVs

## NHTSA Federal Automated Vehicles Policy

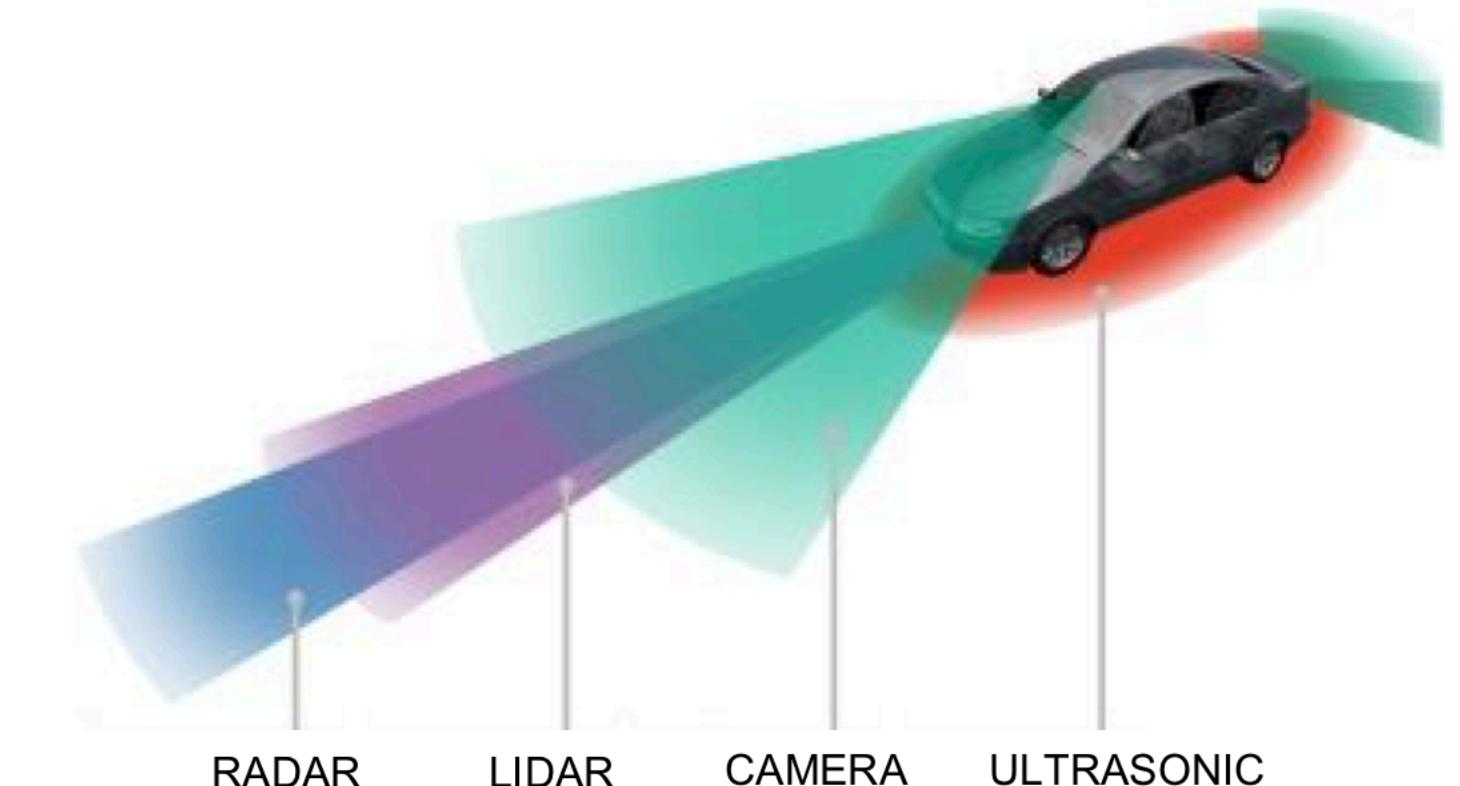
September 2016



- *Vehicles should record, ..., all information relevant to the event... [accident, crash]*
- *... should collect, store and analyze data regarding positive outcomes ...*
- *... explore a mechanism to facilitate anonymous data sharing ...*

• <b>RADAR:</b> 4-6 Sensors	0.1 - 15 Mbit/s /Sensor
• <b>LIDAR:</b> 1-5 Sensors	20 - 100 Mbit/s /Sensor
• <b>CAMERA:</b> 6-12 Sensors	500 - 3500 Mbit/s /Sensor
• <b>ULTRASONIC</b> 8-16 Sensors	<0.01 Mbit/s /Sensor
• <b>VEHICLE MOTION, GNSS, IMU</b>	<0.1 Mbit/s /Sensor

TOTAL SENSOR BANDWIDTH: 3Gbit/s (~1.4TB/h) or 40 Gbit/s (~19 TB/h)





# Data Sizes in AVs

**Service Notifier APP 11:06**  
**#awesome Event Identified (388877)**

**Date:** Thursday, June 6th 1:15:46 AM

**Comment:** "#awesome ego slowed for ped approaching, but then changed minds after ped reversed directions"

**Service Notifier APP 04:04**  
**#awesome Event Identified (388501)**

**Date:** Wednesday, June 5th 10:11:07 PM

**Comment:** "#awesome stopped for two prehistoric birds walking across road"

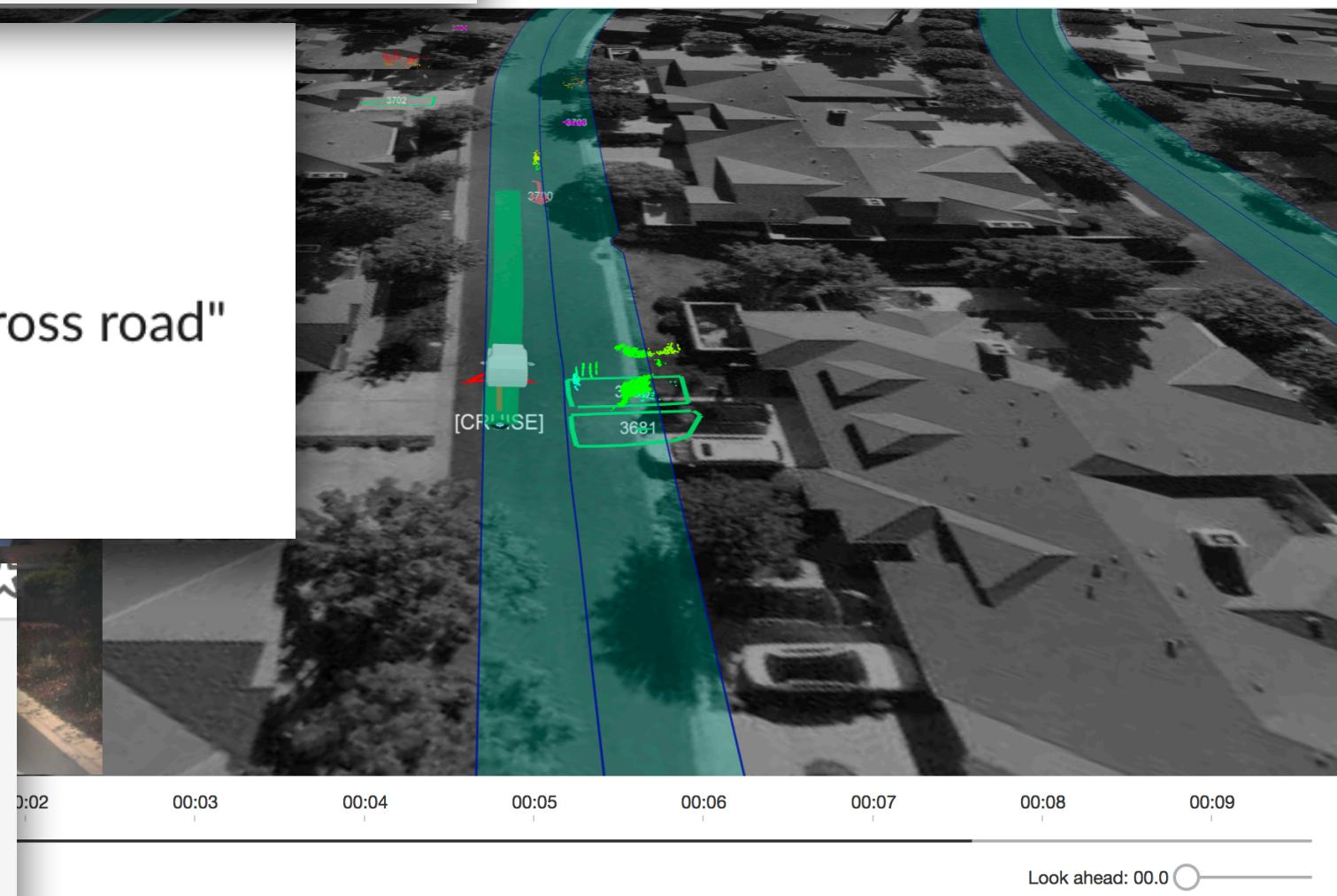
[See Event Details](#) [Download Event \(2394 MB\)](#)

**Service Notifier APP 05:22**  
**Intervention Event Identified (384950)**

**Date:** Tuesday, May 21st 10:02:37 PM

**Comment:** "harsh brake while #overtaking #vehicle in a right turn #intervention #turning"

[See Event Details](#) [Download Event \(2925 MB\)](#)



**Details**  
ID: 388930  
Created: June 5th 2019, 5:06:05 pm  
Deployment: vgcc  
Bag: 17098 ↗  
Metadata UUID: dc11ef47-0737-4775-9f6b-eae279ee7a83

**Build Info**  
Commander: v2.2.3 SHA ↗  
Commander Timestamp: June 3rd 2019, 11:54:02 am  
Annotations: vgcc:2.4.1-rc.4  
PCDS: vgcc:2.4.1-rc.4  
Vehicle: moe

[Open in Triage ↗](#)

[Submit for Annotations scale](#)

## Bag Slices

388930  
All topics

2.25 GB ↗

**Bag Context**

05:05:41 PM A ● Attention Marker  
very wide right turn

05:06:05 PM A ● Attention Marker  
#awesome ego interacted naturally with #pedestrian, no one suspects a thing

[See Event Details](#) [Download Event \(2925 MB\)](#)

- Core capability development: model training, improvement, visualization, insights, etc
- Triage: explore, analyze and organize field reports, incidences, data
- Fleet management: scheduling, dispatch
- Metrics system: measuring progress in components, modules, systems
- Simulation results analysis

## 1. Integration is at the core

- Multiple data generation sources, rates, types, performance
- Staged decisions, forks, merges, “hard calls”

## 2. Deployment in safety critical setups

- Machine learning (algorithms, model compression, data handling) – everything we learned at the summer school is applicable, today
- Modeling – industry is largely driven by roboticists, we need fresh ideas, perspectives right at the foundations
- Interface with policy makers, data-driven regulation societal preparedness
- Business models, how to use this technology effectively
- Measurement of impact, progress – metrics beyond classical robotics

- Advances in sensing, new modalities (LiDAR, RaDAR, ...), algorithms
- Advances in machine learning
  - Systems/model composition, uncertainty handling, measuring task specific progress
- Advances in systems
  - Fault tolerant, low power, low-bandwidth data transfer, storage, analysis
- Advances in energy storage (battery technology)
- Speed up automation in other sectors, such as agriculture

- You are already equipped
  - Machine learning, data science
  - Software engineering
- Online courses, e.g. Udacity nano degrees
- Experiment with open source frameworks
  - ROS {1, 2}, Autoware, Apollo
  - Simulators: CARLA, LGSVL-sim, Gazebo
  - Datasets: KITTI, nuScenes, commonroad



# Questions, Remarks



# We are hiring!

<https://voyage.auto/careers>

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[billy@voyage.auto](mailto:billy@voyage.auto)

<https://www.linkedin.com/in/bokal/>