

# Connectivity Enables Automation

Henry Liu

Director, Mcity & CCAT

Professor, Civil and Environmental Engineering  
University of Michigan, Ann Arbor

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- Pre-competitive research
- Pooled and tailored



**TOYOTA**

**verizon**

**HONDA**

**DENSO**

**StateFarm**

RESEARCH



LABS



EDUCATION  
& OUTREACH



- Early deployment
- Data collection

- Informing
- Voice of reason
- Talent development





**Mcity test facility is the world's first purpose-built proving ground for connected and automated vehicles.**

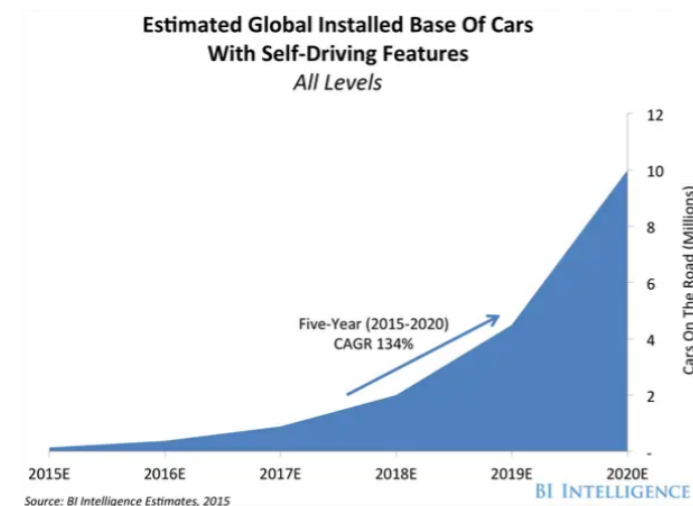
# Automated Vehicle Technology Hypes in 2016

HOME > TECH

## 10 million self-driving cars will be on the road by 2020

Insider Intelligence , BI Intelligence Updated Jun 15, 2016, 7:25 AM

Self-driving cars are no longer a futuristic idea. Companies like Mercedes, BMW, and Tesla have already released, or are soon to release, self-driving features that give the car some ability to drive itself.



BI Intelligence



# Automated Vehicle Technology Downfalls in 2022

**FORTUNE**

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## A long, cold winter is here for self-driving cars

BY **ALEXEI ORESKOVIC**

October 18, 2022 at 3:11 PM CDT



# Major gap exists in safety performance

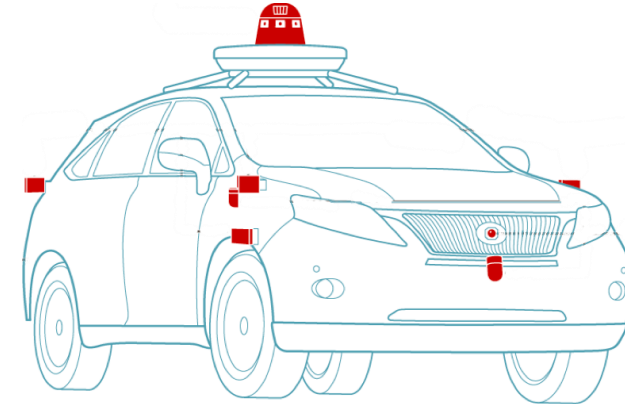
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## Human Drivers



**1 accident every  $\sim 10^6$  miles**

## Automated Vehicles



**1 disengagement every  $\sim 10^4$  miles**

[2020 Disengagement Report from California DMV](#)

# Curse of Dimensionality (CoD)

The CoD Problem is that when the dimensionality increases, the volume of the space increases so fast that the available data become sparse.

Weather



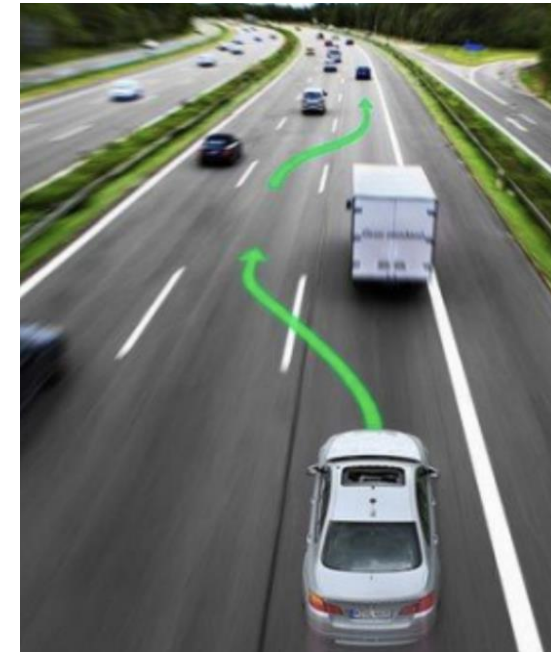
Road Infrastructure



Road Users



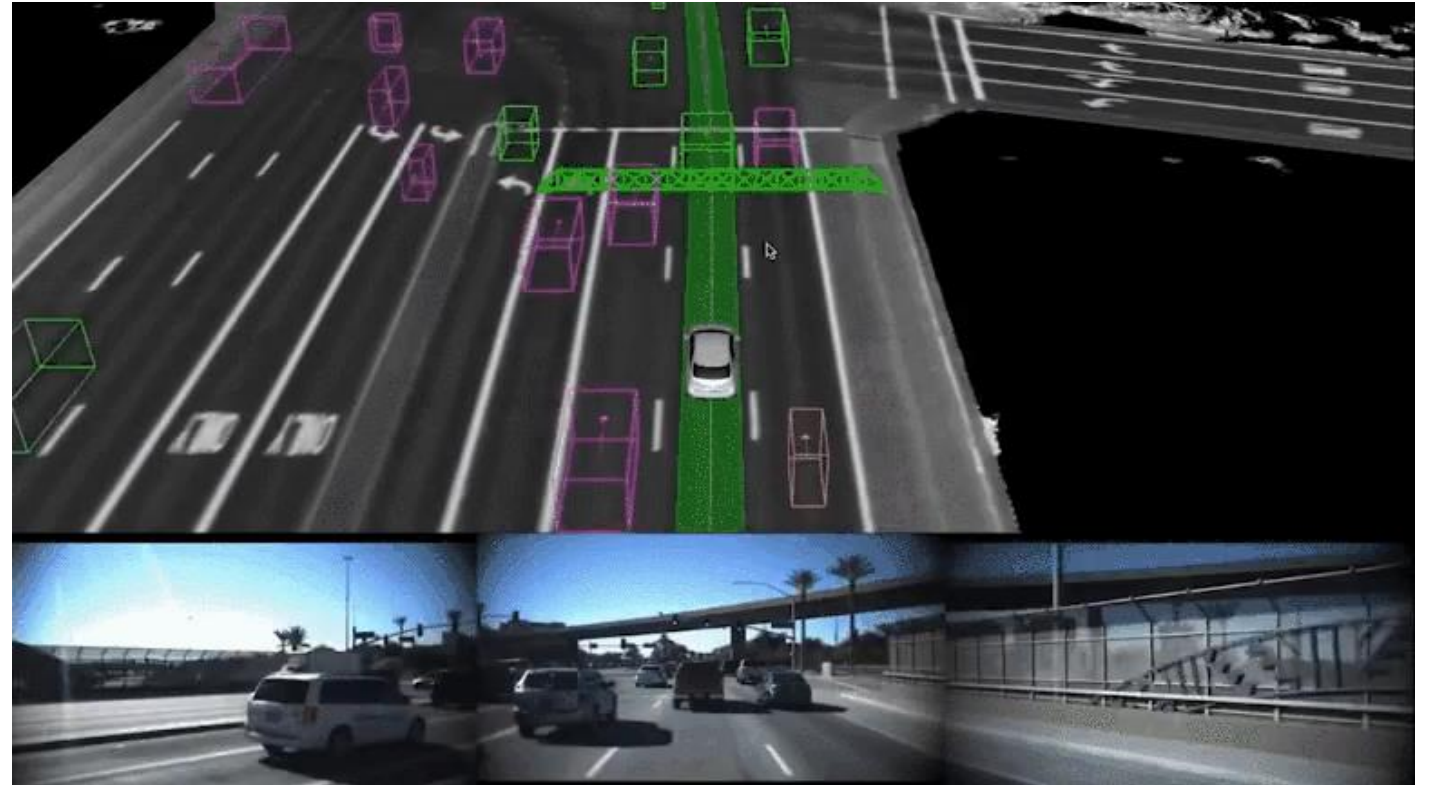
Maneuvers



# Curse of Rarity (CoR)

The basic concept of CoR is that the occurrence probability for the events of interest is so rare that most available data contain little information regarding the rare events.

[Liu, H. and Feng, S. (2022)]



The automated vehicle must give way to the emergency vehicle even it has the right of way. A low probability but potentially safety-critical event.

Source: Waymo, <https://develloppaper.com/waymo-automatic-driving-long-tail-challenge-2019/>



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For AVs, both CoR and CoD problems exist —the rarity of safety-critical events in high-dimensional driving environments—are the root causes of various safety challenges in the development and deployment of AVs.

The current deep learning algorithms cannot handle this type of cases.

# Single Vehicle Intelligence



Picture from autoweek.com

**Tesla's evolutionary approach**

**SAE L2**

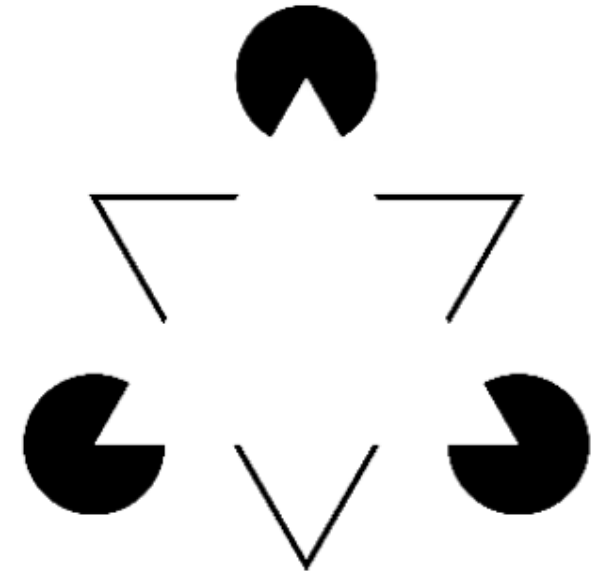


Picture from wired.com

**Waymo's revolutionary approach**

**Target for SAE L4, but no commercial product**

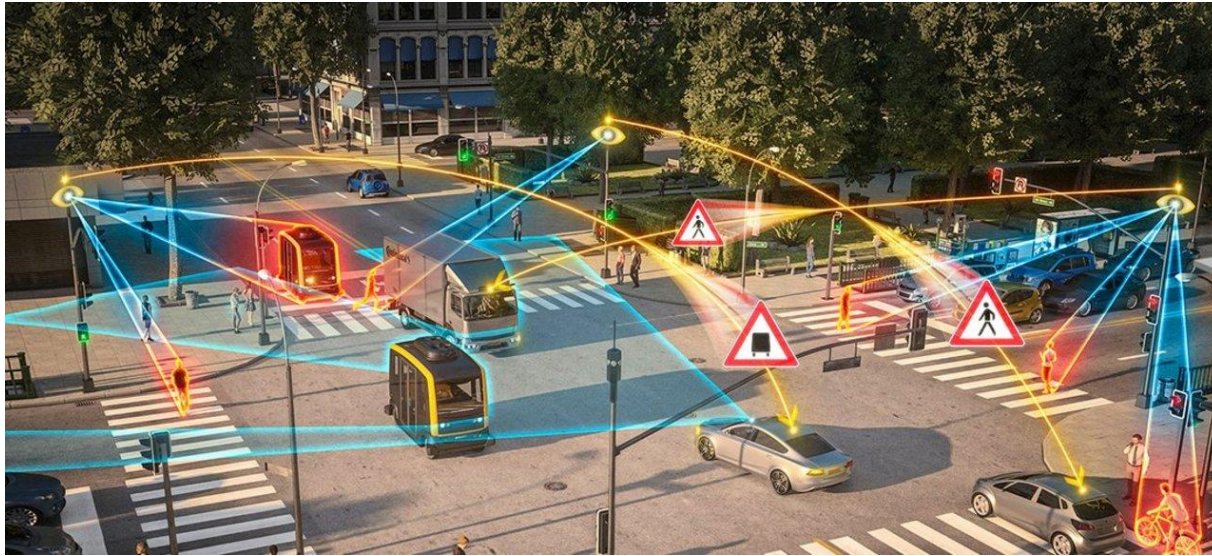
Lack of Top-down Reasoning



**The Kanizsa Triangle Visual Illusion**

Source: Cummings, M. (2020)

# Connectivity Enabled Automation



Picture from continental.com

**SAE L4 vehicles will need connectivity for wide deployment**

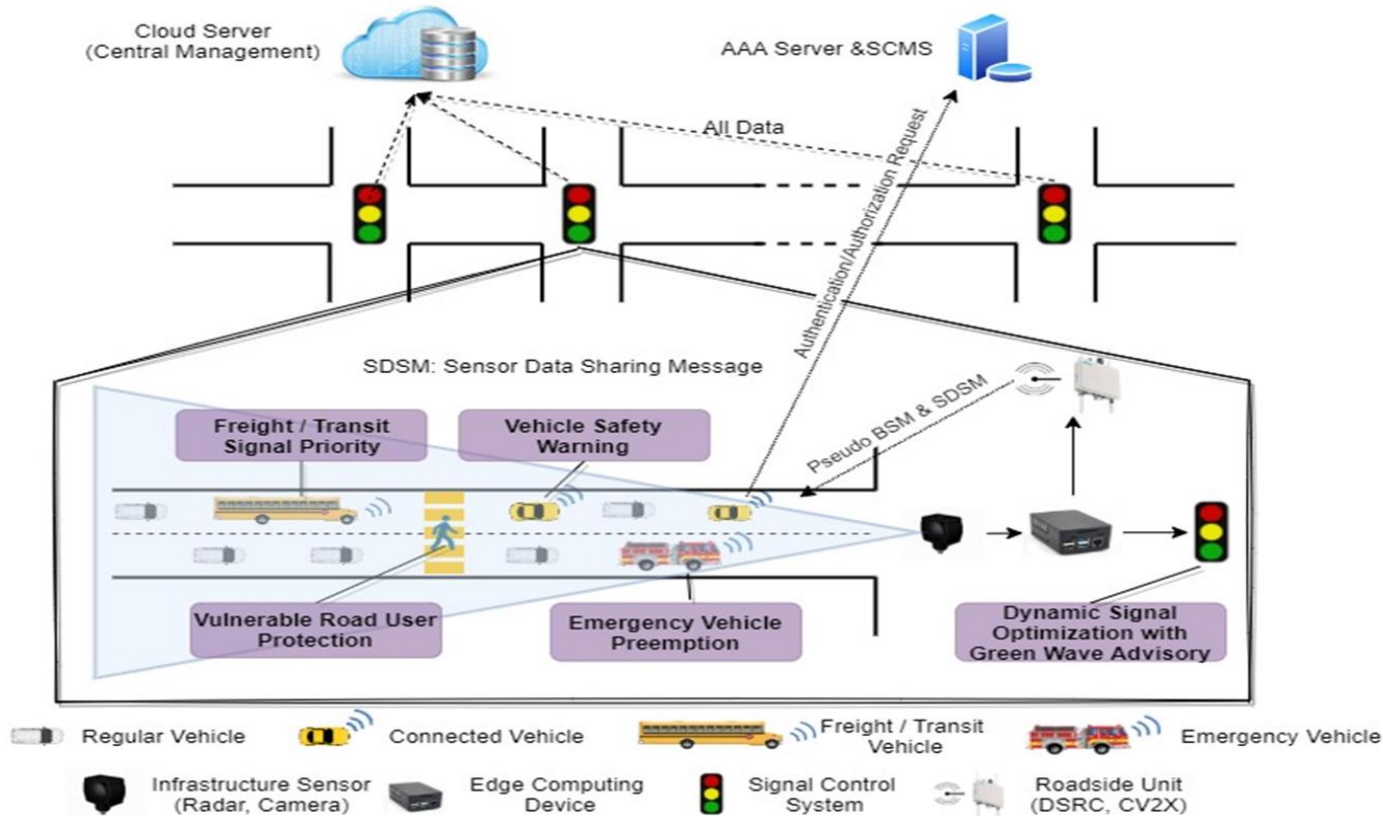
Major Roadblocks:

- System Complexity and Vulnerability
- Trust between V2V and V2I



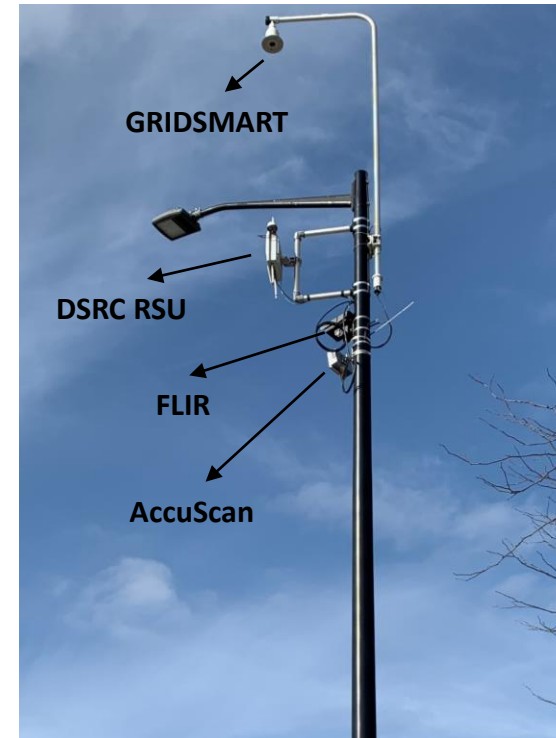
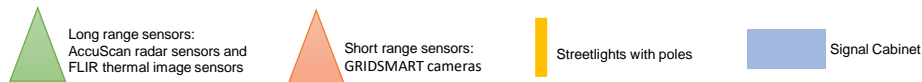
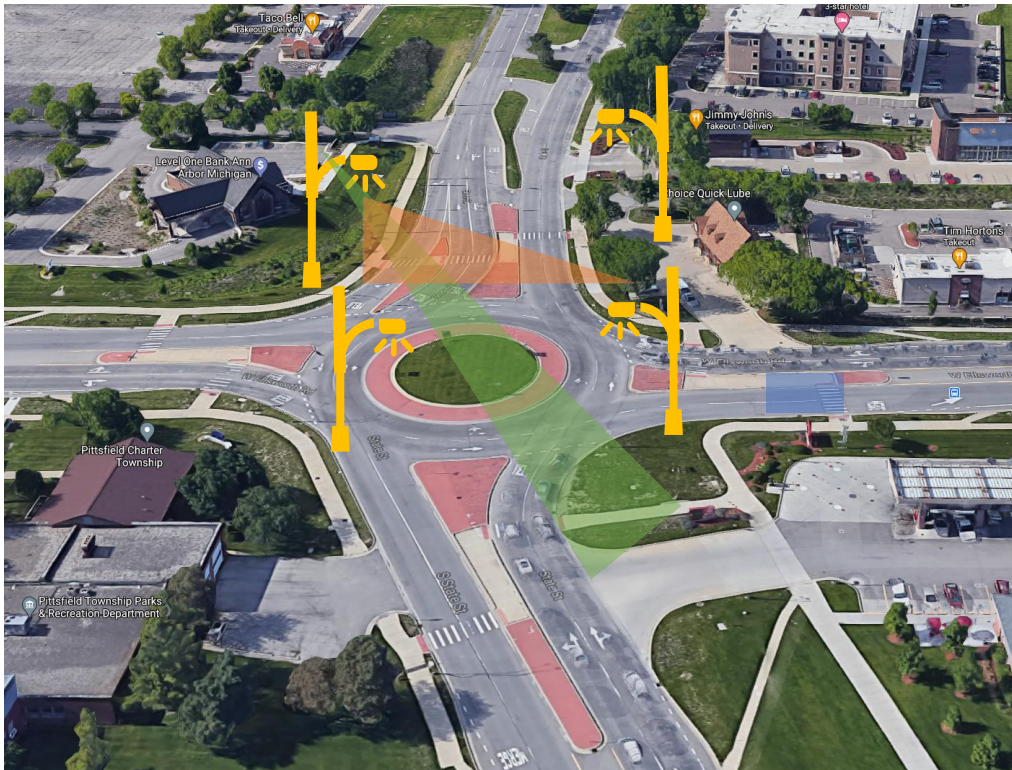
# Smart Intersections Project (2021 – 2024)

Develop an infrastructure-assisted cooperative driving automation **testbed** to accelerate CAV deployment, funded by USDOT

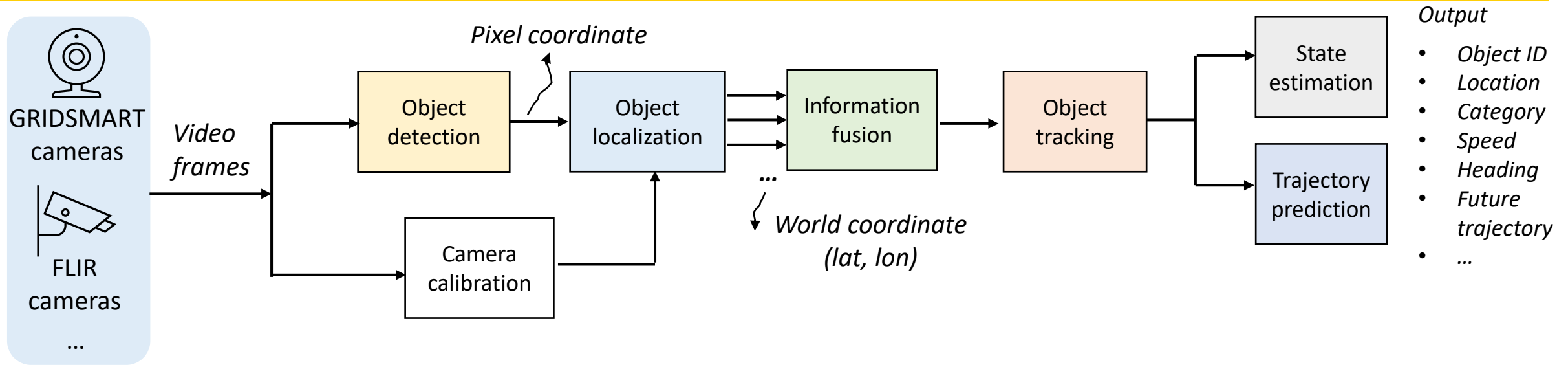


# Implementation at State St./Ellsworth

- In 2020, State St./Ellsworth Rd roundabout had 69 crashes and 6 injuries and was ranked #14 for the most dangerous intersections in Michigan.



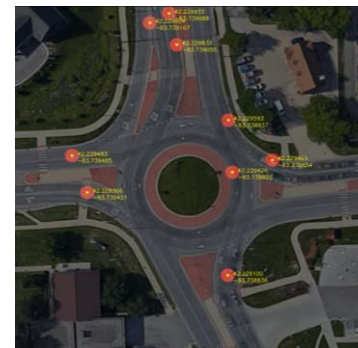
# Roadside Perception Pipeline with Edge-Cloud Architecture



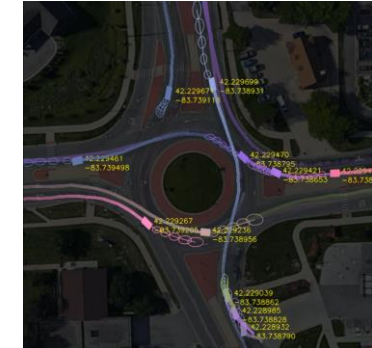
Raw image



Detection



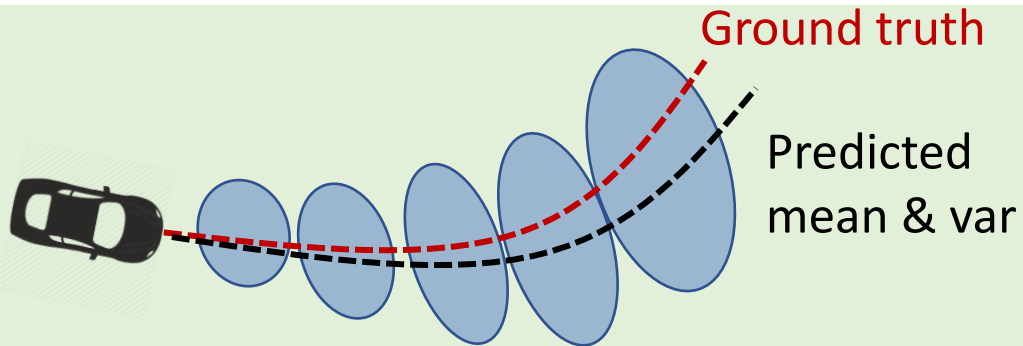
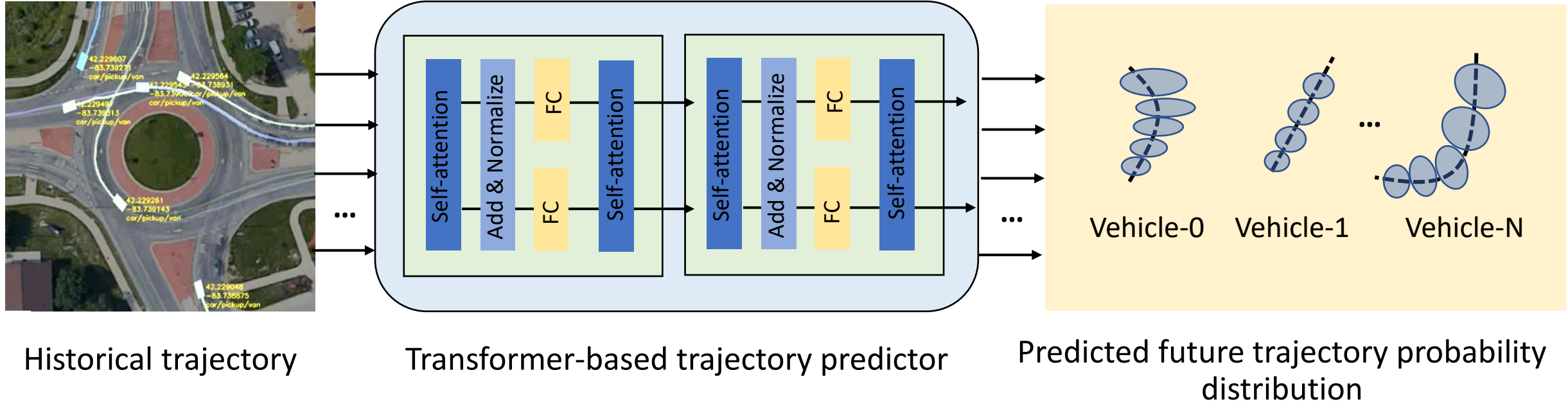
Localization/ Tracking



Motion prediction



# Transformer-based Trajectory Prediction



$$\operatorname{argmax} \mathcal{L}_w = \prod_{t=1}^{T_{out}} \prod_{i=1}^N p(z_i^{(t)} | x_i^{\{-T_{in}, \dots, 0\}}, w)$$

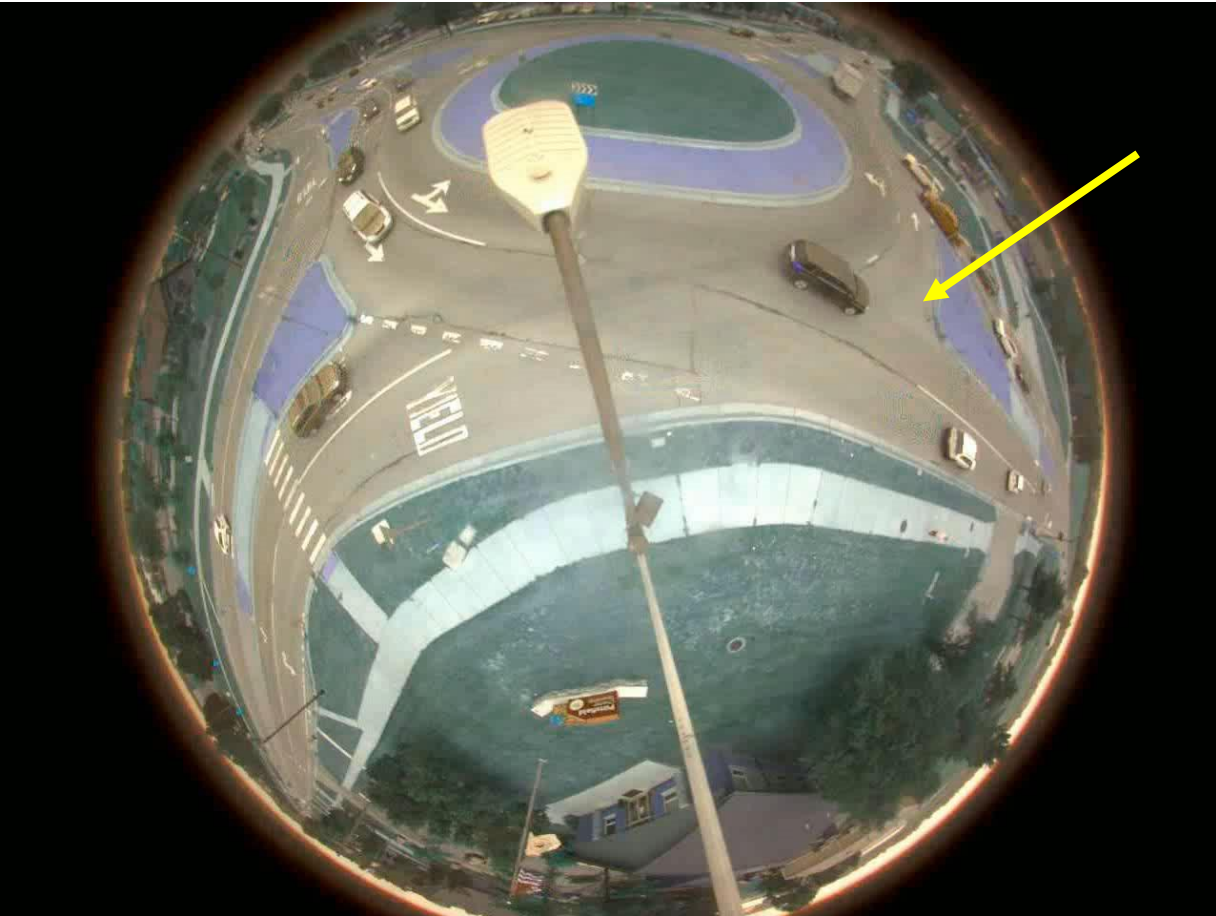
$$p(z_i^{(t)} | x_i^{\{-T_{in}, \dots, 0\}}, w) = \text{BERT}(\mathbf{X}_{i=\{1, \dots, N\}}^{t=\{-T_{in}, \dots, 0\}}) \sim N(\boldsymbol{\mu}(x), \boldsymbol{\Sigma})$$

# Object Detection, Fusion, Tracking, and Prediction

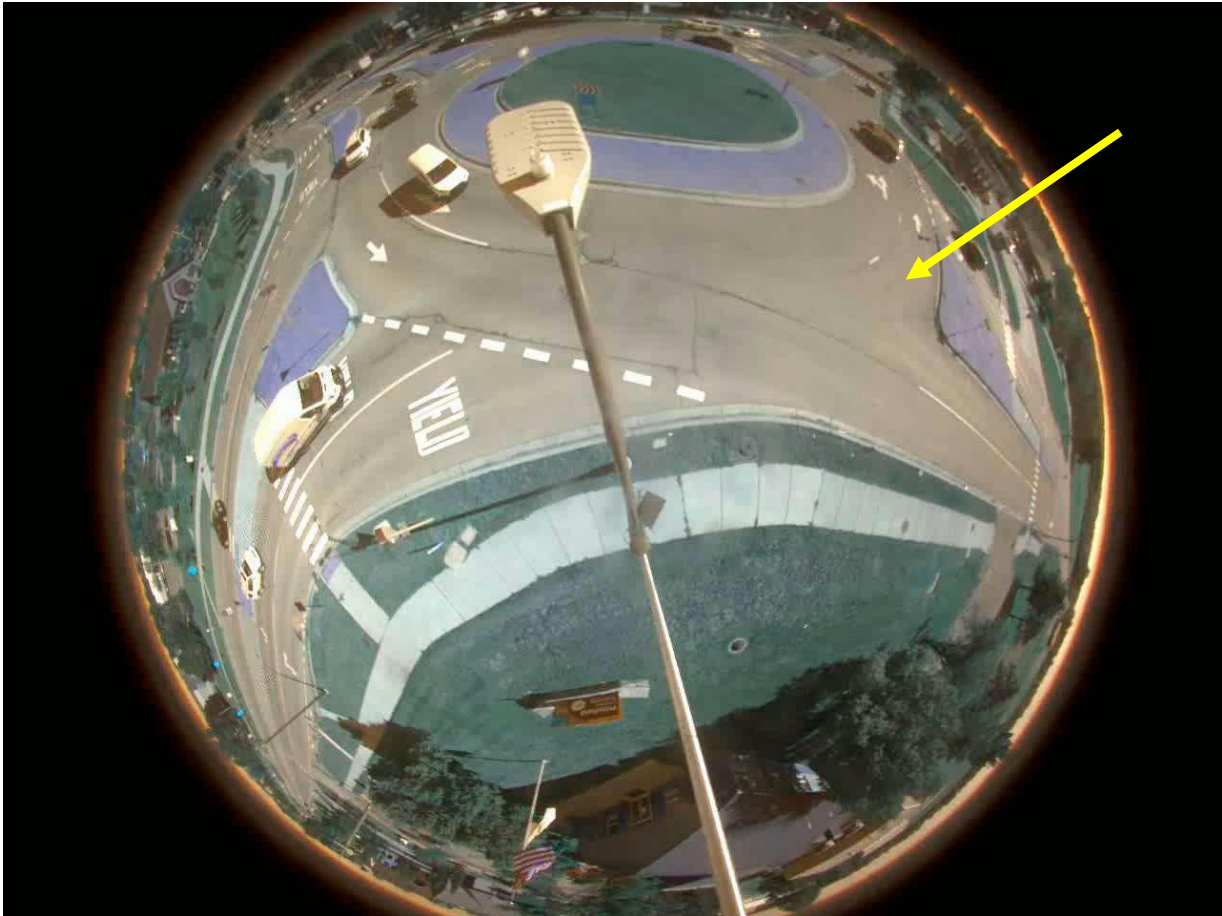




# Identified Crash/Near-Miss Events



2021/09/13 | 14:04:56

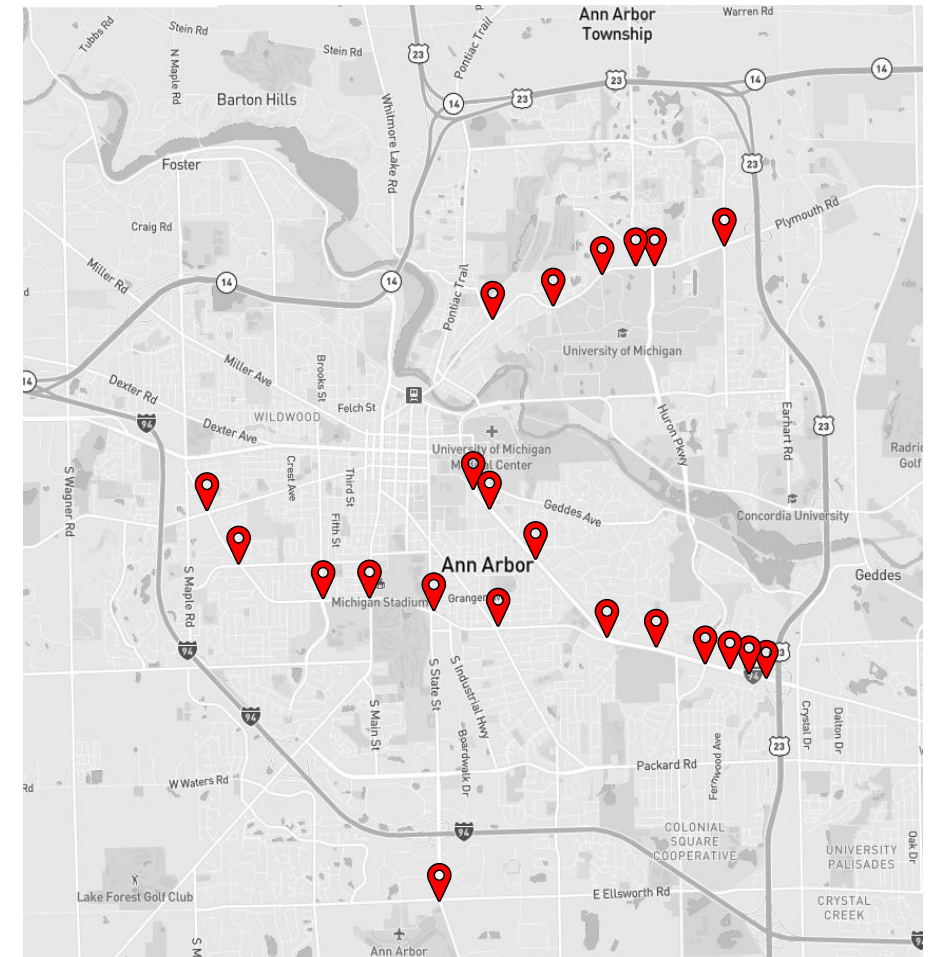


2021/09/24 | 10:18:55



# Smart Intersection Deployment

- Support cooperative driving automation
- Support traffic management
  - Signal optimization
  - Green wave speed advisory
  - Improve environmental sustainability
- AWS-based mobility data center



# **Mcity 2.0: An Autonomous Testbed for Autonomous Vehicles**

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- Develop the Mcity Test Facility into a **fully autonomous, mixed reality, remote-capable facility**.
- The focus of the project is to build digital infrastructure upon physical infrastructure for AV testing.
- Funded by NSF with additional funding from U of M
- 48 days/year of track time reserved for NSF-funded research

# Mcity 2.0

Mcity is developing digital infrastructure to overlay the physical Mcity Test Facility that will enable remote use of the Mcity track and set it apart as the next-generation autonomous vehicle test facility.

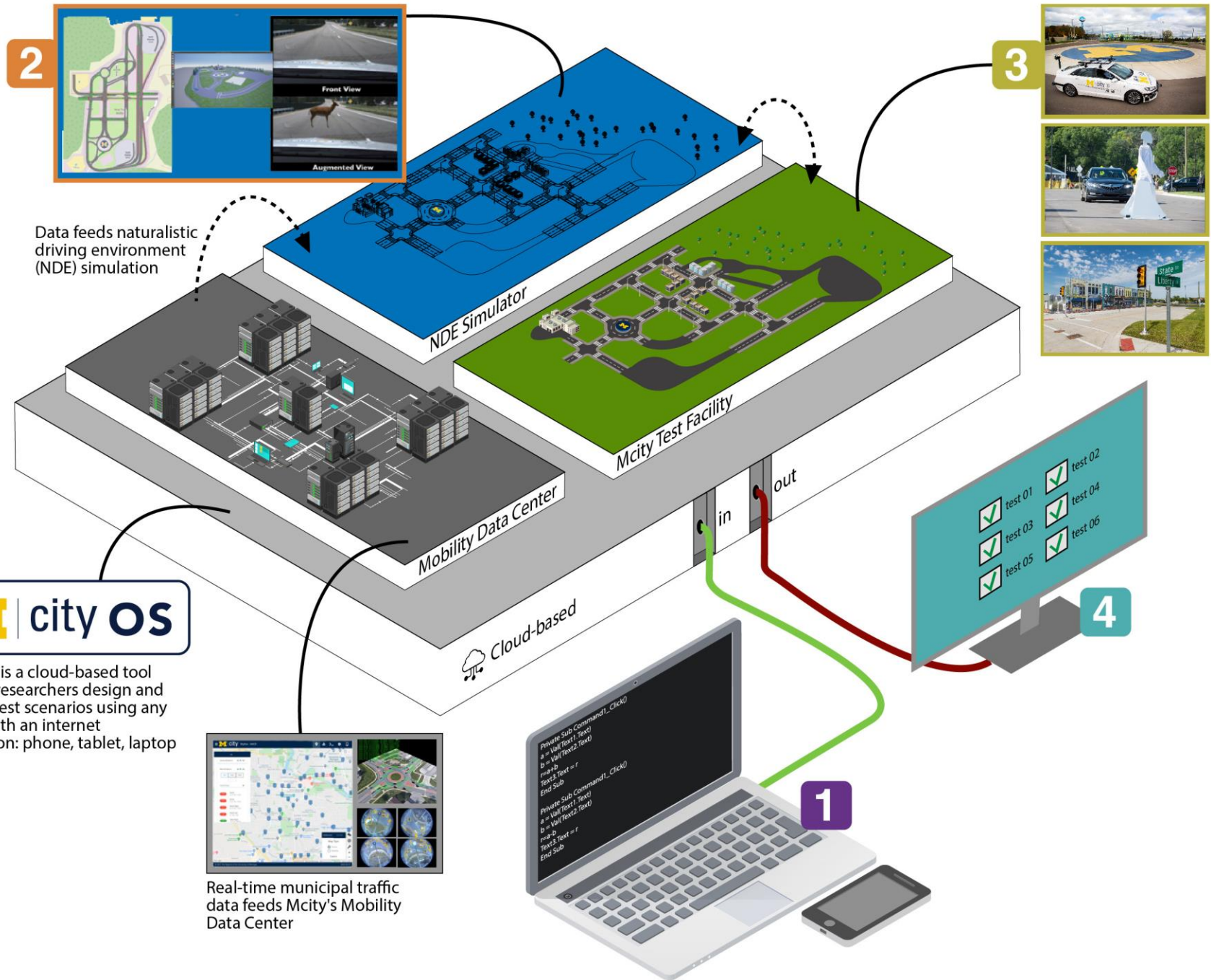
## HOW IT WORKS

**1** Researcher uploads code that controls vehicle or infrastructure and test scenarios using Mcity OS app.

**2** Researchers test, tweak, retest scenarios in naturalistic driving environment (NDE) simulation before sending to Mcity Test Facility for execution.

**3** Test scenarios designed using Mcity OS are executed at Mcity Test Facility, where real vehicles interact with and respond to virtual vehicles and proxy objects.

**4** Researcher participates remotely while test scenario they designed is conducted at the Mcity Test Facility. Test results are accessible remotely via Mcity OS.

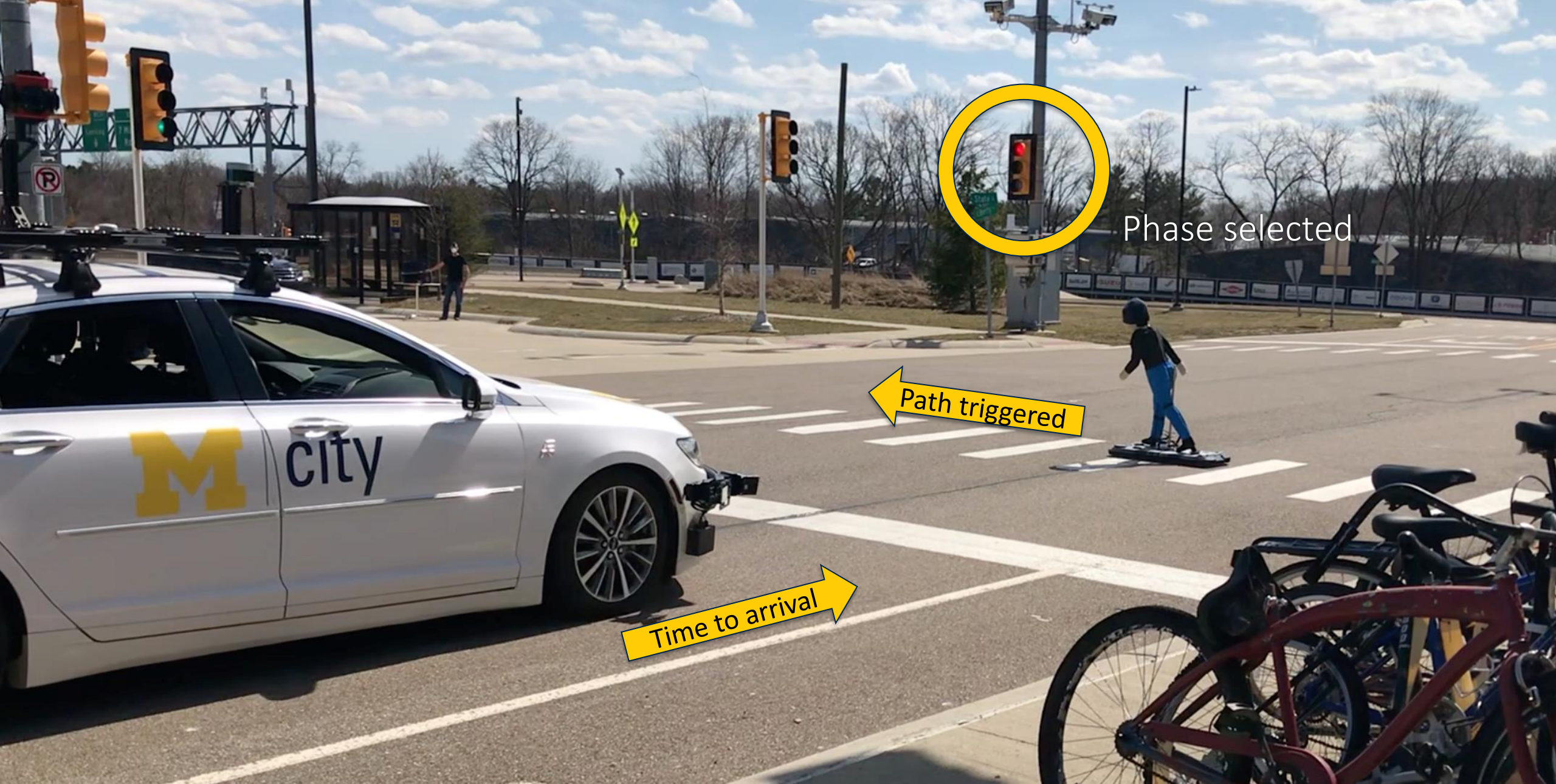




McCity OS makes it possible for researchers to create and execute complex, sophisticated, and easily repeatable test scenarios. McCity OS runs on any internet-enabled device to control all the features of the facility.



Intelligent tools  
for AV testing.



Phase selected

Path triggered

Time to arrival



# Proxies & VRUs | AV System Testing

## Goals

- Easily Repeatable Testing
- Fleet of “low cost” Proxies
- High Level of availability and integration
- 3<sup>rd</sup> Party Robots as a Service



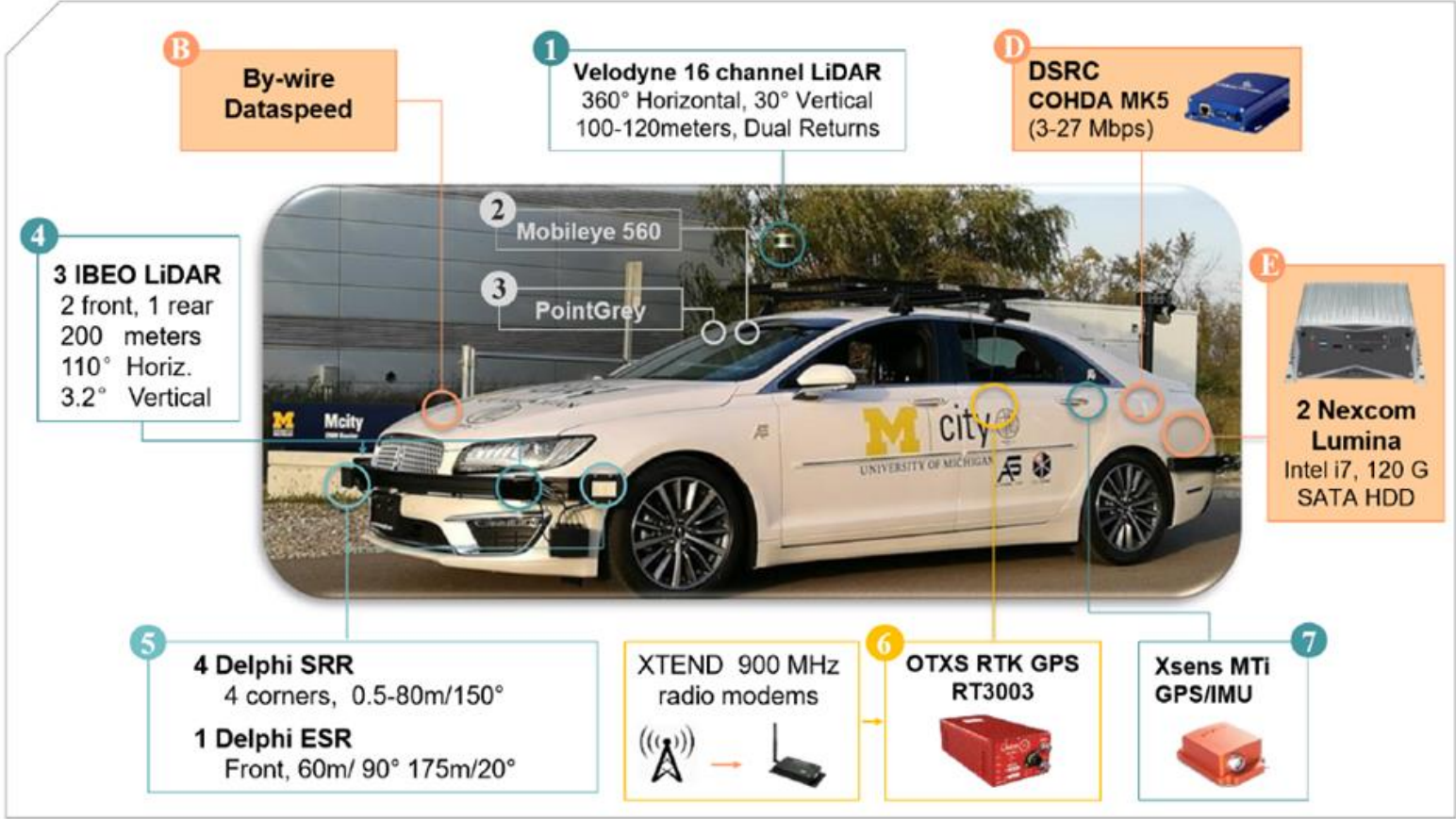


# Naturalistic Driving Environment Simulation

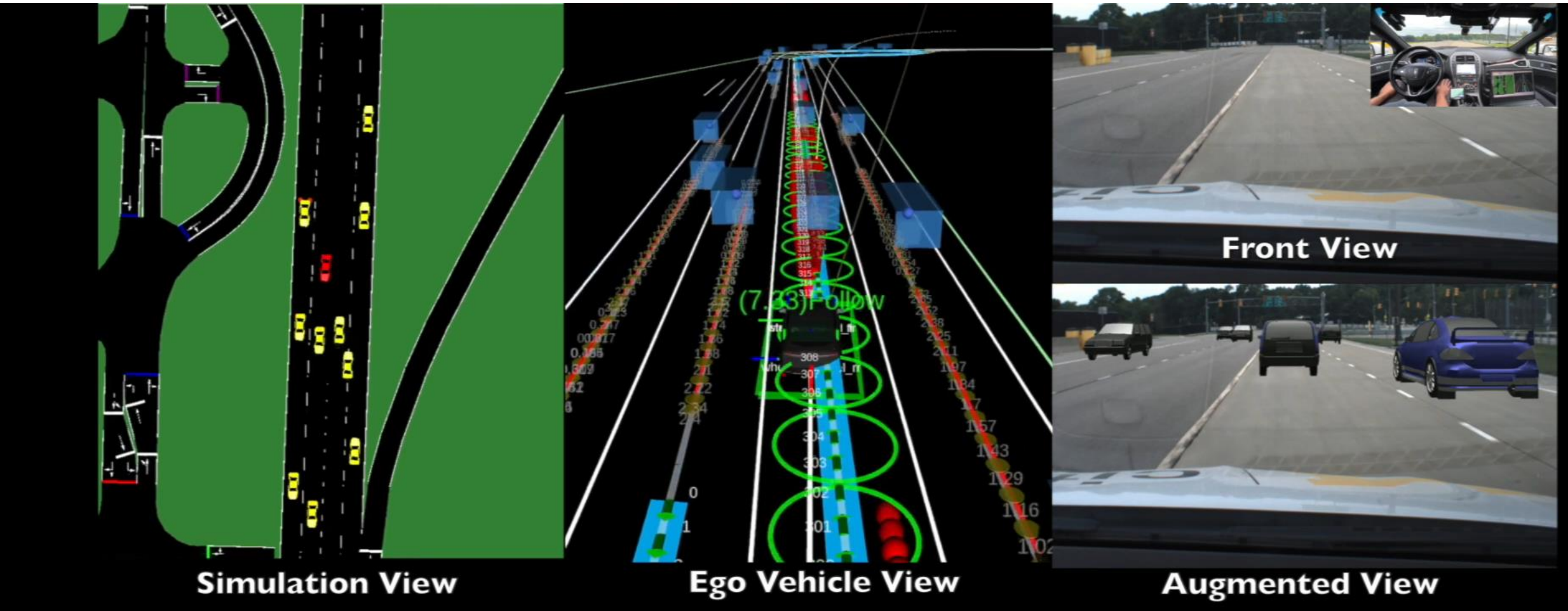
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**Example 1:  
Angle crash caused by failure to yield**

# Mcity OpenCAV



# Mcicity Mixed Reality Testing



[Feng et al., *Nature Communications*, 2021]



# Related Publications

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- Liu, H. and Feng, S. (2022) “Curse of rarity” for autonomous vehicles, under review. <https://arxiv.org/abs/2207.02749>.
- Zou, Z., Zhang R., Shen, S., Pandey G., Chakravarty P., Parchami A., H. X., and Liu, H. (2022). Real-time Full-stack Traffic Scene Perception for Autonomous Driving with Roadside Cameras. International conference of Robotics Automation (ICRA). [10.1109/ICRA46639.2022.9812137](https://doi.org/10.1109/ICRA46639.2022.9812137)
- Feng, S., Yan, X., Sun, H., Feng Y., and Liu H. (2021). Intelligent driving intelligence test for autonomous vehicles with naturalistic and adversarial environment. Nature communications, 12(1), 1-14. <https://doi.org/10.1038/s41467-021-21007-8>



**LEADING** THE TRANSFORMATION  
TO CONNECTED &  
AUTOMATED VEHICLES