



**UNT**  
UNIVERSITY  
OF NORTH TEXAS  
EST. 1890

**TexITE Dallas Section Meeting**

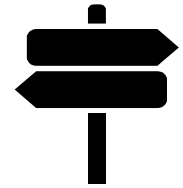
# **Leveraging Connected Autonomous Vehicles for Traffic Management: Challenges and New Directions**

**Dr. Song Fu and Dr. Qing Yang**

**EST. 1890**

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering





# Outline

- Connected Autonomous Vehicles (CAV) group at UNT
- CAVs for traffic management
- CAV projects
  - Edge Computing for CAVs
  - Finding Blurry Vehicles
  - Cooperative Perception
  - Occluded Road Sign Detection
- Future Work

**EST. 1890**

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering



# CAV Group @ UNT

- Drs Fu and Yang, and collaborators in EE & ME
- 7 PhD, 2 MS, and 3 undergraduate students
- Equipment
  - Two golf carts with sensors
  - Processing unit: NVIDIA PX2
  - A Polaris GEM4 (incoming)
  - Self-driving truck for testing
- Collaborations
  - Toyota, Fujitsu, Peterbilt, Frisco Public Works, NCTCOG, ...



# Sensors



LiDAR

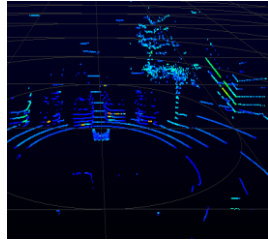


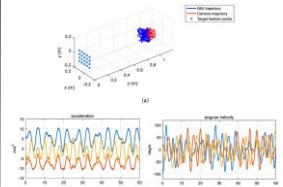
Image-Based Camera



GPS



IMU



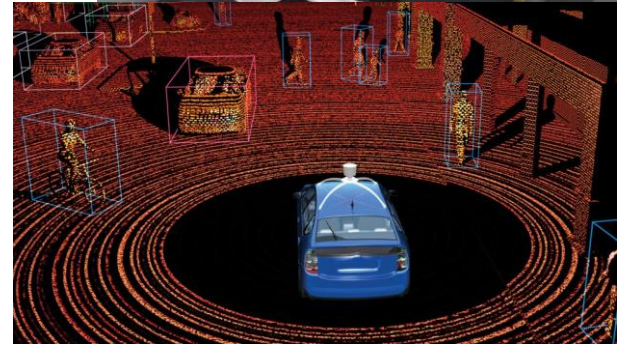
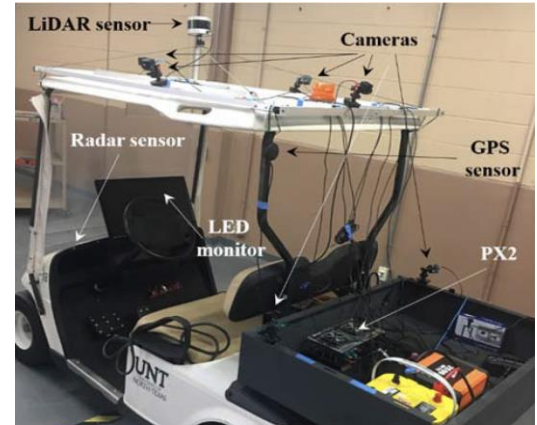
EST. 1890

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering



# Projects @ CAV Group

- Accurate pedestrian and cyclist detection using 2D and 3D data fusion
- Finding blurry vehicles using Generative Adversarial Network
- Designing efficient deep learning models for autonomous vehicles
- Cooperative perception for connected and autonomous vehicle
- Edge computing for traffic monitoring



EST. 1890

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering



# CAV Workshop

- Connected Autonomous Vehicles Workshop 2019 @ UNT  
<http://www.cse.unt.edu/~song/CAVWorkshop/>

Technical presentations, CAV test platform demonstration, poster session, open discussion, ...



**You are warmly welcome to join CAV Workshop 2020!**

EST. 1890

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering





# CAVs for Traffic Management



EST. 1890

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering



# Opportunities

- **Connected vehicles** technologies for congestion control, accident awareness, self-driving, and more
- Vehicle-to-**infrastructure** communication to improve road safety, transportation forecast, and traffic management
- **Edge computing** with information-sharing portal for traffic management partners and private sector collaborators sharing real-time data



EST. 1890

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering





# Edge Computing for CAVs

Low-latency and quick-response decision making for autonomous vehicles

**EST. 1890**

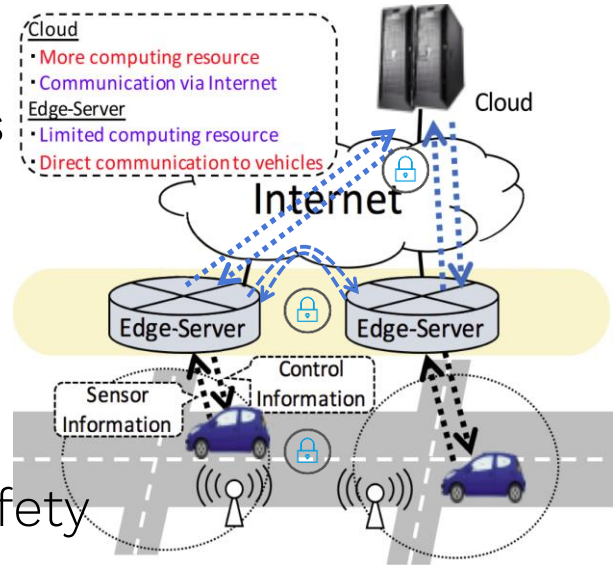
DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering



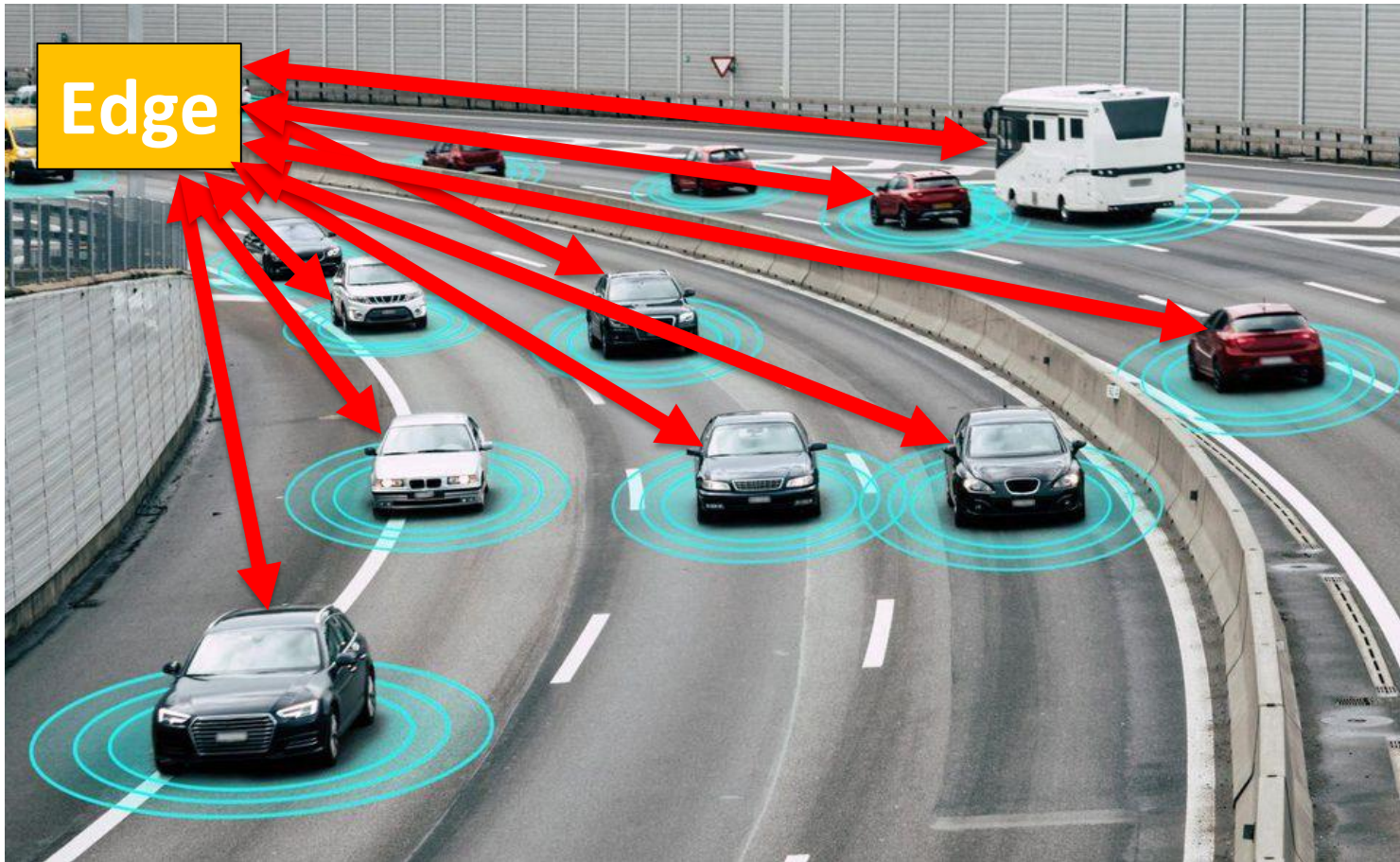
# Edge Computing

Edge servers vs. cloud datacenter

- Edge servers are much closer to cars
- Low latency for data movement, high responsiveness
- More computing capability than cars
- Local traffic management
  - Traffic monitoring & update, accident analysis, intersection safety

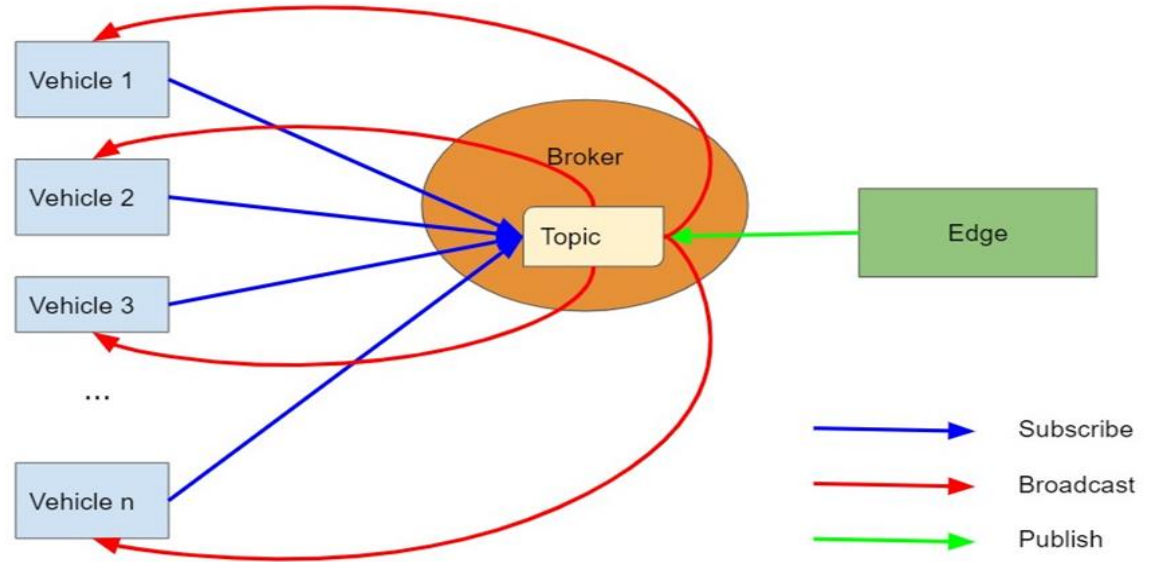


Edge



# Vehicle-Edge Communication

- Publish-Subscribe paradigm
- Message queuing telemetry transport (MQTT)

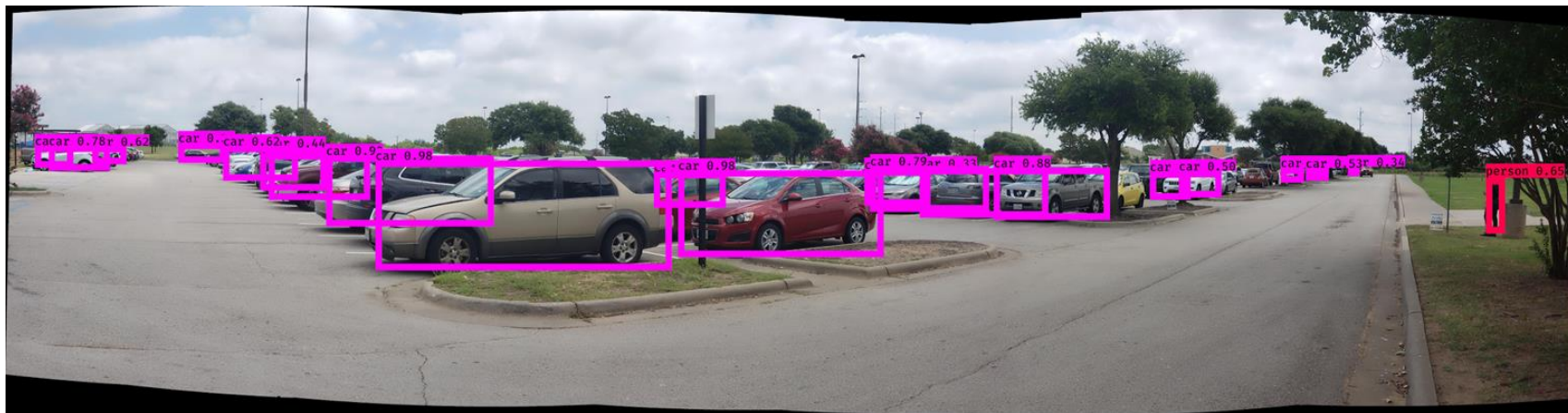




# Case 1



# Data Fusion & Car Detection Result



EST. 1890

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering

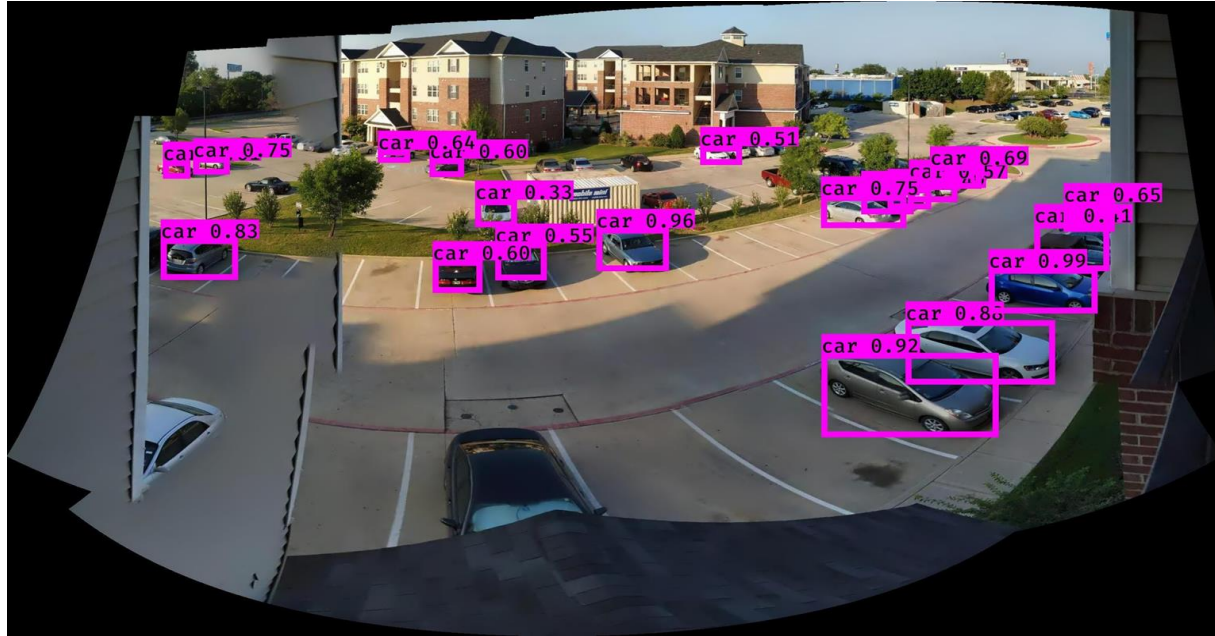




# Case 2



# Data Fusion & Car Detection Result



EST. 1890

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering



# Finding Blurry Vehicles

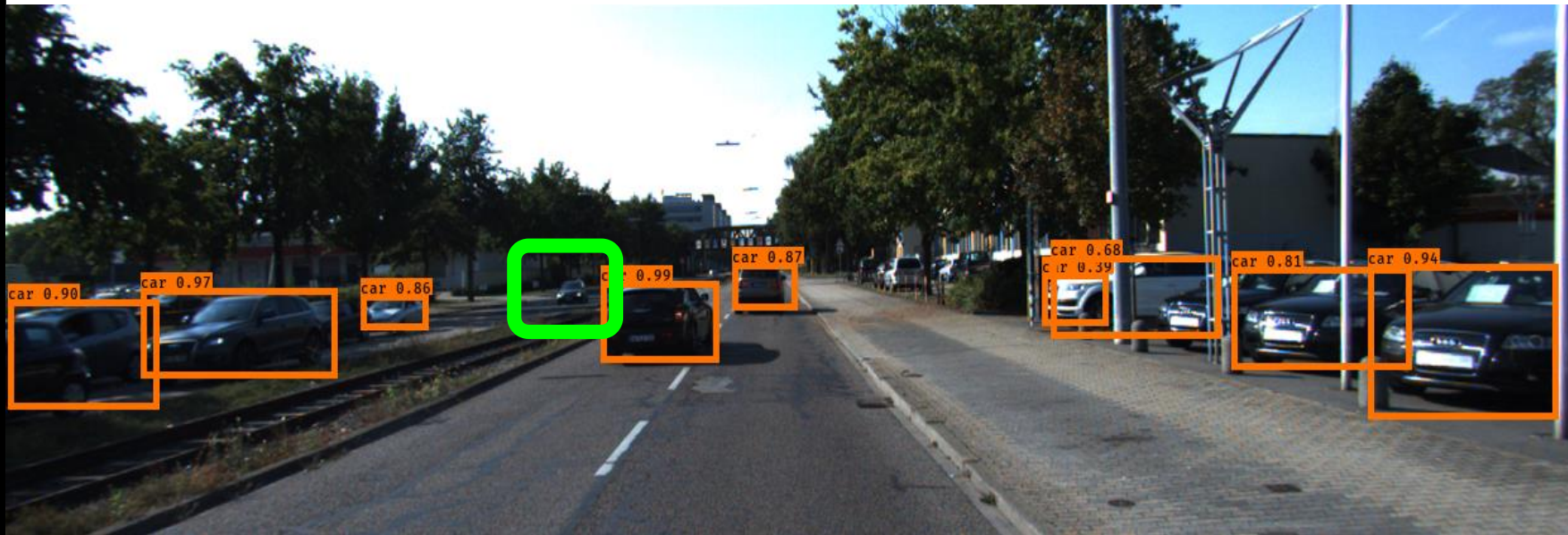
Using enhanced super resolution Generative Adversarial Network (SRGAN)

**EST. 1890**

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering



# Motivation



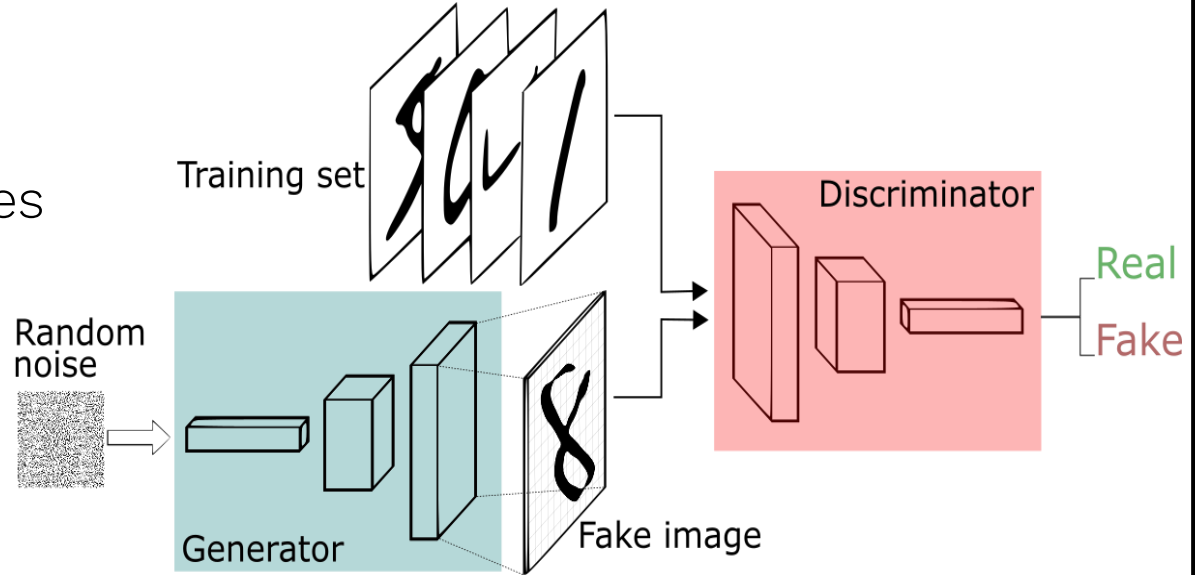
EST. 1890

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering



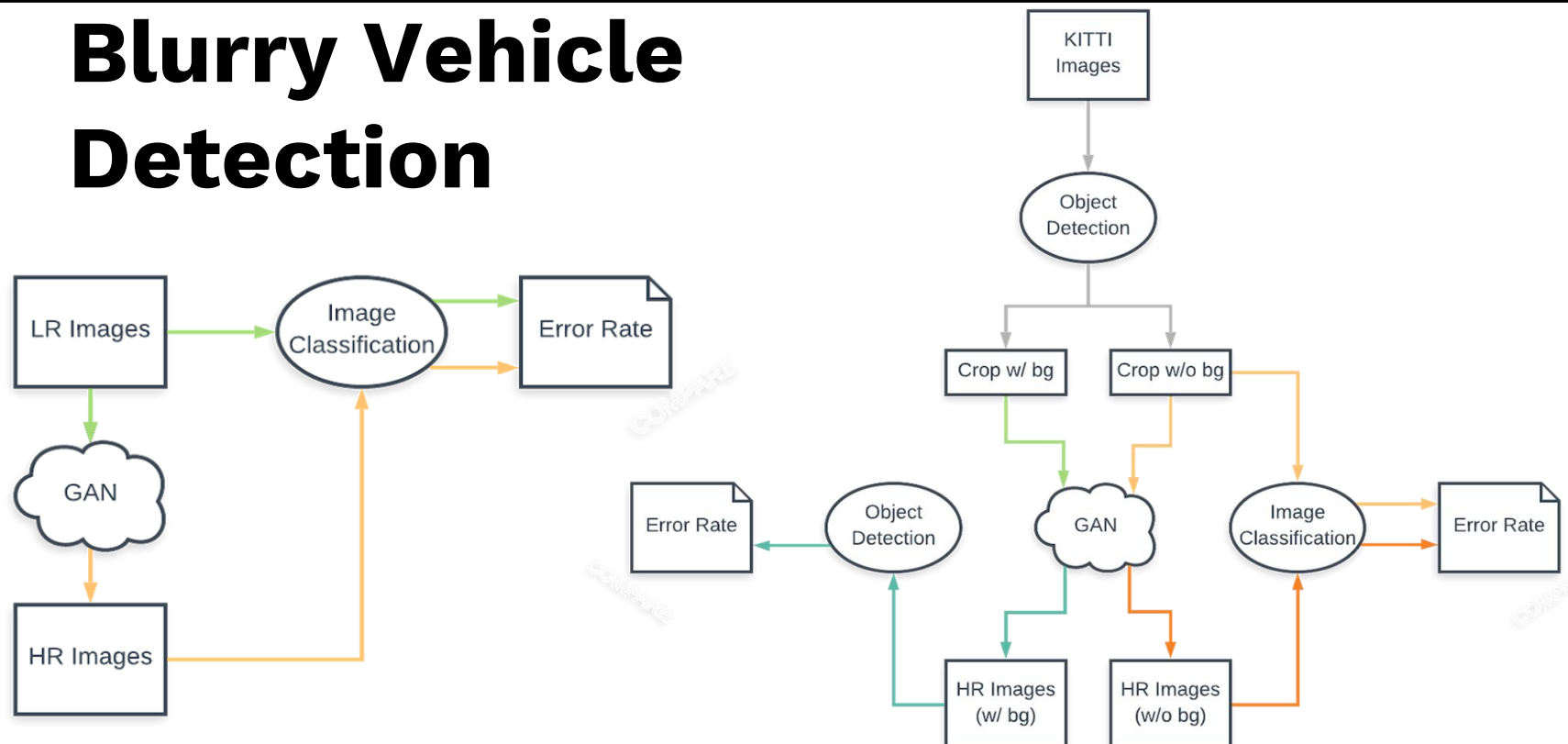
# Generative Adversarial Networks

- Deep Neural Net (DNN) architectures
- It consists of two networks
  - Generator
  - Discriminator





# Blurry Vehicle Detection



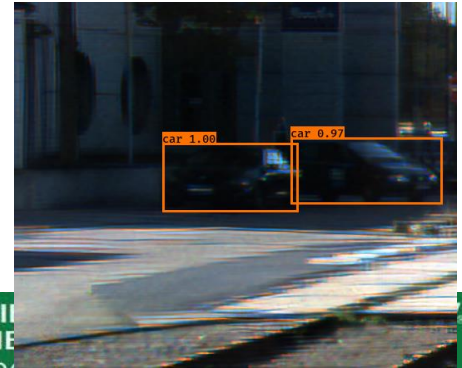
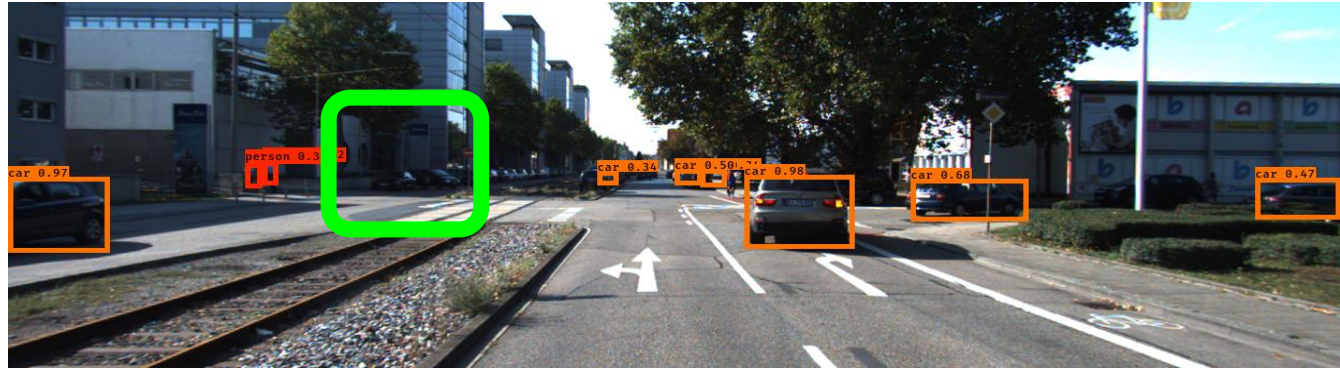
EST. 1890

DEPARTMENT OF COMPUTER SCIENCE & ENGINEERING  
College of Engineering





# Vehicle Detection Results





EST. 1890

COMPUTER SCI  
ENGINEERING  
College of Engineering

UNI

# Cooperative Perception

LiDAR based data fusion for connected and autonomous vehicles

**EST. 1890**

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering



# Goals of Data Fusion



Enhances the accuracy of object detection for autonomous vehicles



Provides real-time information for traffic management and traffic control



Provides anonymity of private information within the sensing range



Increases system's reliability in case of sensor failures

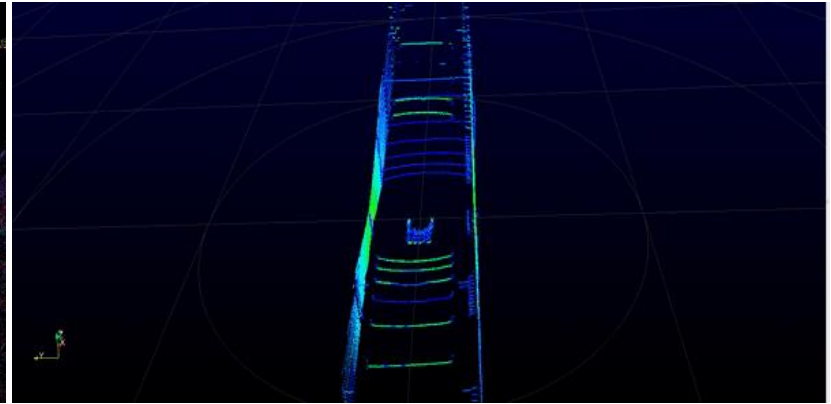
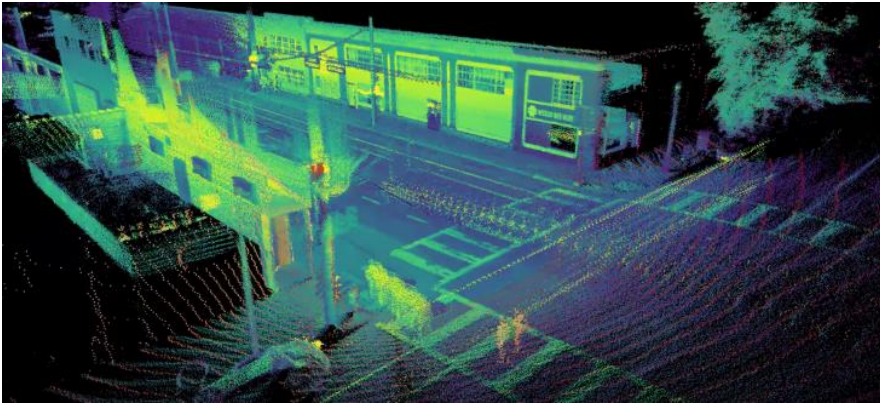
**EST. 1890**

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering





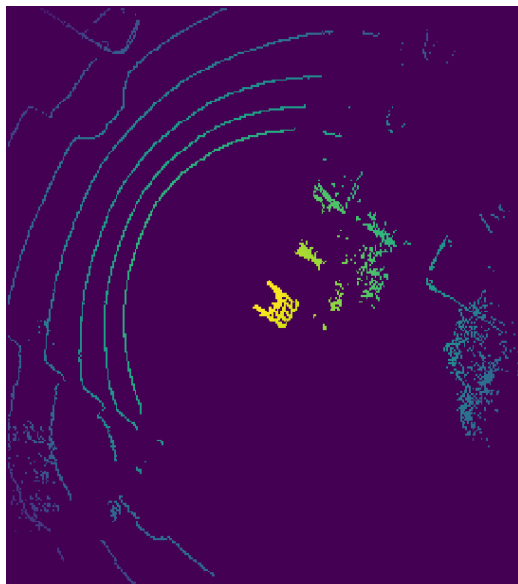
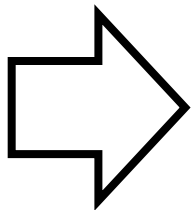
# Light Detection and Ranging (LiDAR)



EST. 1890

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering





# Point Cloud Rotation

Rotation Matrices

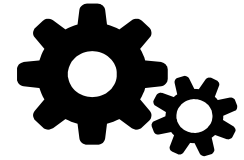
$$R_x(\theta) = \begin{bmatrix} 1 & 0 & 0 \\ 0 & \cos \theta & -\sin \theta \\ 0 & \sin \theta & \cos \theta \end{bmatrix}$$

$$R_y(\theta) = \begin{bmatrix} \cos \theta & 0 & \sin \theta \\ 0 & 1 & 0 \\ -\sin \theta & 0 & \cos \theta \end{bmatrix}$$

$$R_z(\theta) = \begin{bmatrix} \cos \theta & -\sin \theta & 0 \\ \sin \theta & \cos \theta & 0 \\ 0 & 0 & 1 \end{bmatrix}$$



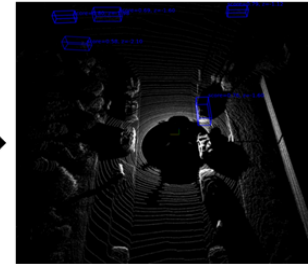
# SPOD Architecture



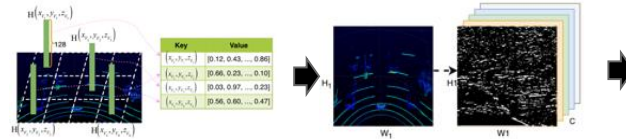
64-Beam LiDAR Frame



*Sparse Point-Cloud Object Detection (SPOD) Architecture*



64-Beam LiDAR Frame with VoxelNet



**Loss function:**  
(1) a probability score of the proposed region of interests  
(2) the locations of proposed regions

EST. 1890

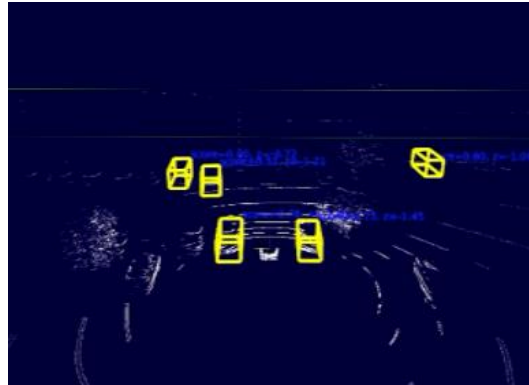
DEPARTMENT OF COMPUTER SCIENCE & ENGINEERING  
College of Engineering



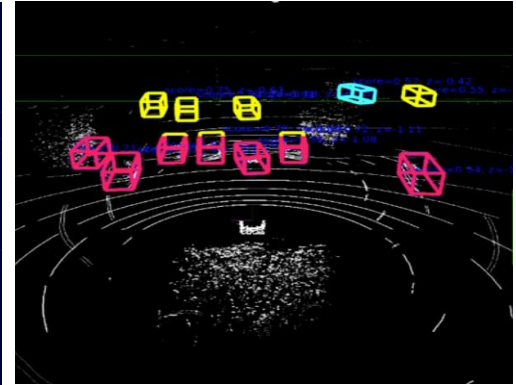
# Object Detection on Fused Frames



Vehicle #1



Vehicle #2



Fused Results

EST. 1890

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering



# Occluded Road Sign Detection

Detect occluded road signs using autonomous driving vehicle sensors

**EST. 1890**

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering





# Challenges



Current AV technologies are not designed for occluded sign detection



Limited amount of training dataset for occluded road signs



Existing solutions fail when they are directly applied



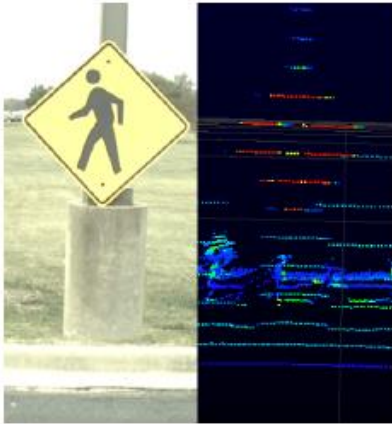
LiDAR-assisted and transfer-learning based solution

**EST. 1890**

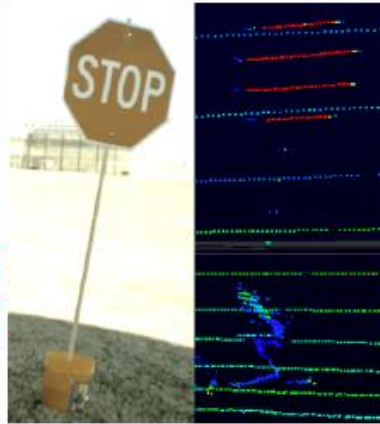
DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering



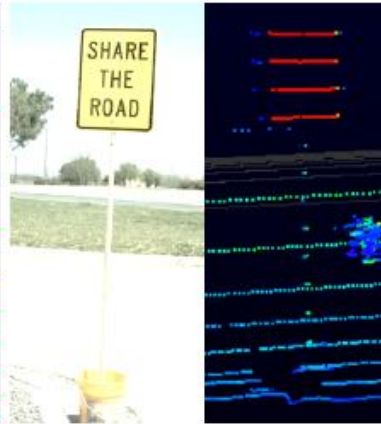
# LiDAR-Assisted Detection



(a) Pedestrian-crossing sign



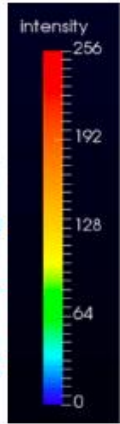
(b) Stop sign



(c) Share-the-road sign



(d) Left-turn-only sign



(e)

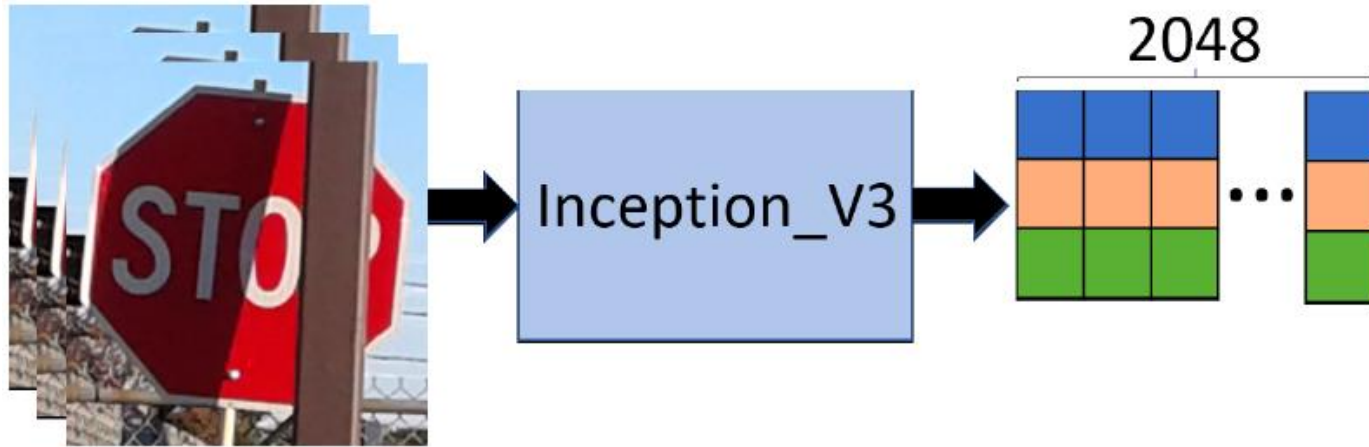
EST. 1890

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering





# Transfer Learning Based Solution



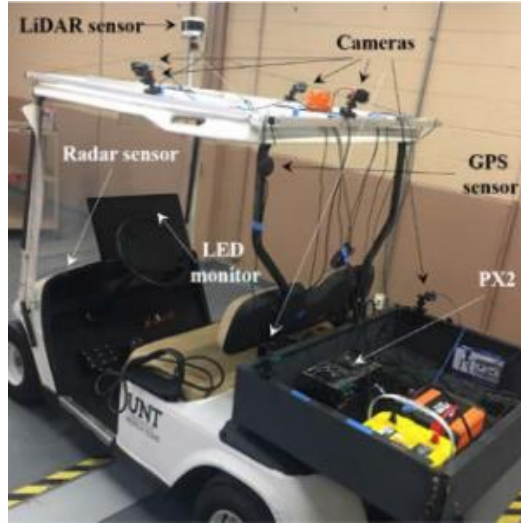
EST. 1890

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering



# Experiment Setup

- Share-the-road sign & stop sign
- Various lighting conditions, angles, distances, backgrounds
- 500 occluded & 500 non-occluded



EST. 1890

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering

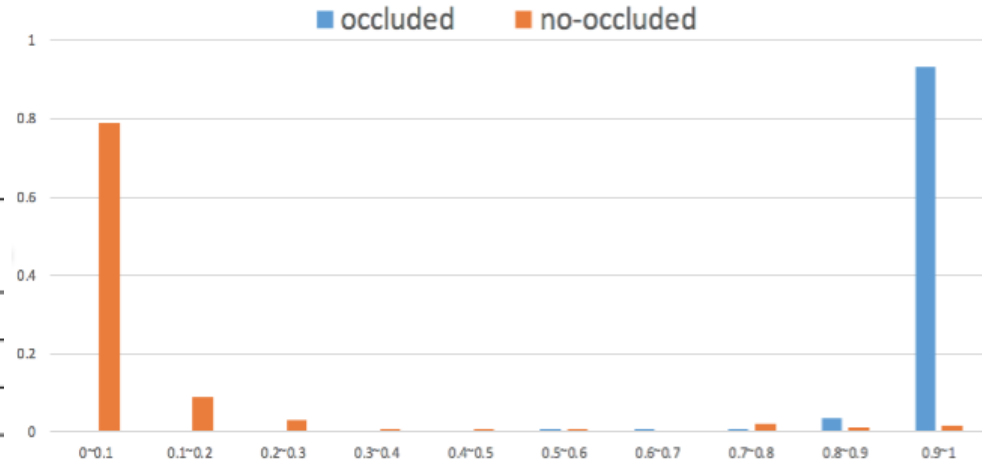


# Experiment Results



Approaches	SSD	OSCN
mAP	51.26%	96.34%

Size	Approaches	SSD
100		7.78s
200		14.66s
300		19.74s



EST. 1890

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering



# Future work

- Autonomous vehicles can be leveraged to assess the road sign conditions when they are running on public roads
- A special application (APP) could be developed and deployed on autonomous vehicles which automatically detect road signs in bad conditions and reports the information to DOTs
- A crowd-sourcing based road sign inventory system becomes possible

# Looking forward to collaborations!



Dr. Song Fu ([song.fu@unt.edu](mailto:song.fu@unt.edu), 940-565-2341)

<http://www.cse.unt.edu/~song/>

Dr. Qing Yang ([qing.yang@unt.edu](mailto:qing.yang@unt.edu), 940-565-4899)

<http://www.cse.unt.edu/~qingyang/>

EST. 1890

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering





# Backup Slides

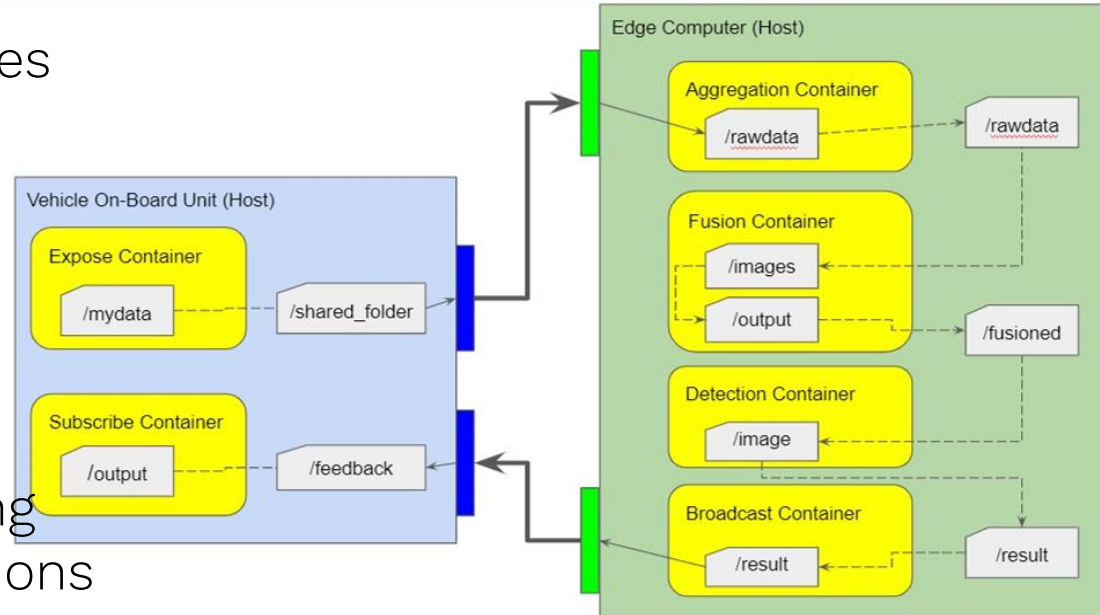
**EST. 1890**

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering

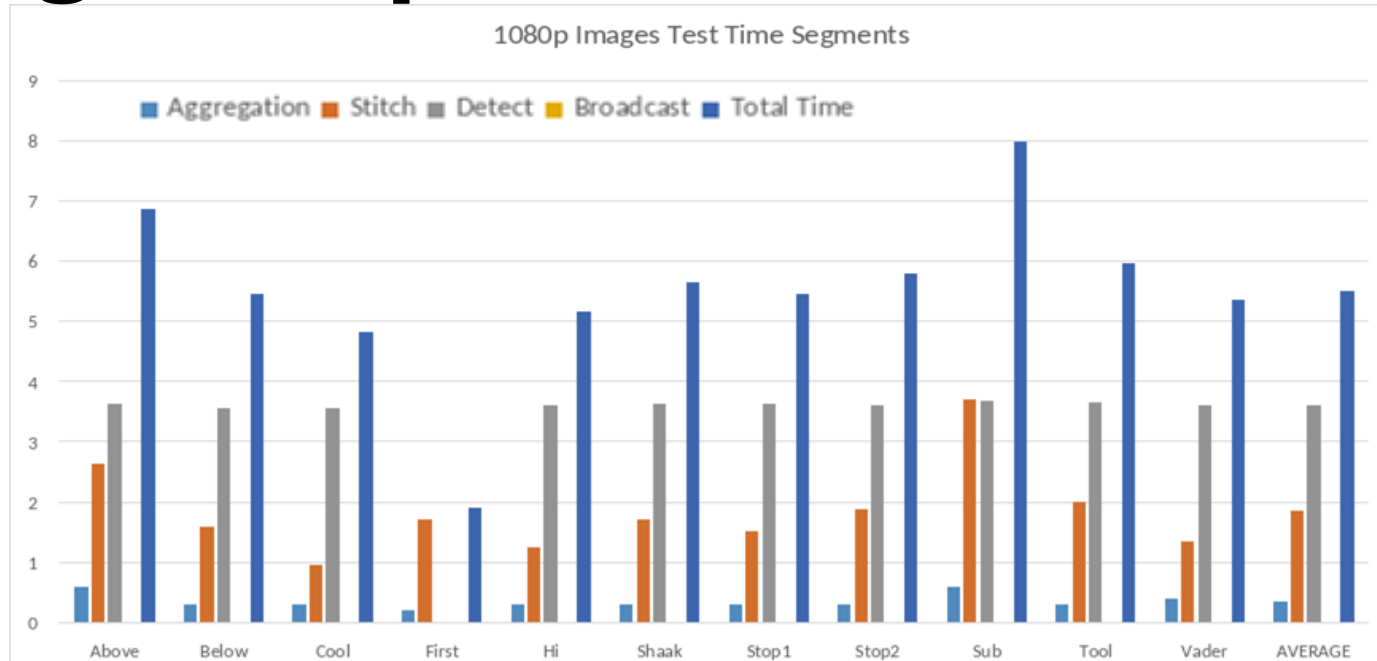


# Vehicle-Edge Framework

- Containers on vehicles and edge
- Functions of edge servers
  - Data aggregation
  - Data fusion
  - Object detection
  - Data broadcasting
  - Other new functions



# Edge Computer Performance

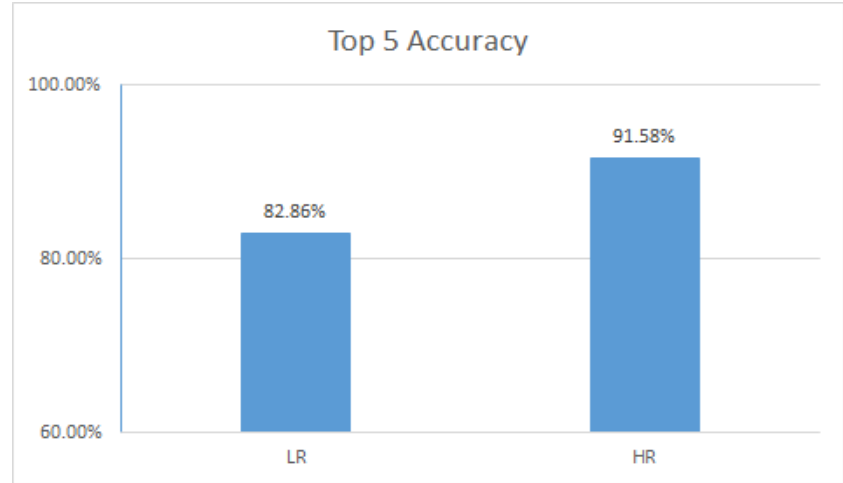
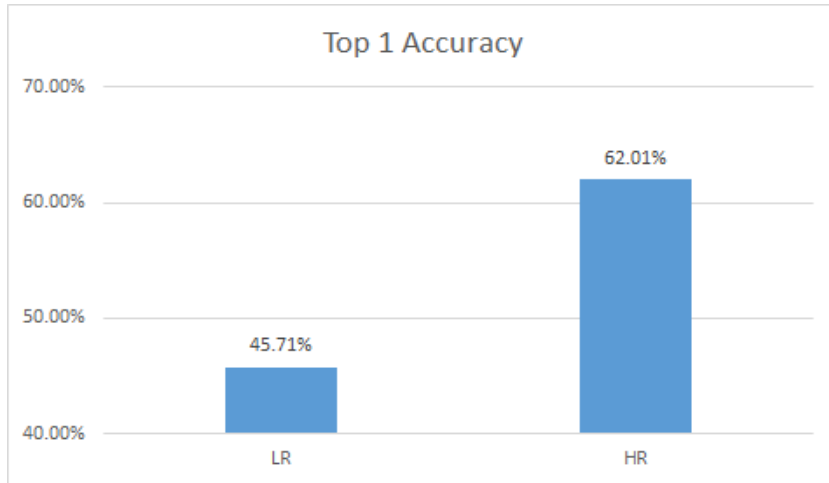


EST. 1890

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering



# Blurry Vehicle Detection Accuracy



EST. 1890

DEPARTMENT OF COMPUTER SCIENCE &  
ENGINEERING  
College of Engineering

