



# Bus Stop Detection

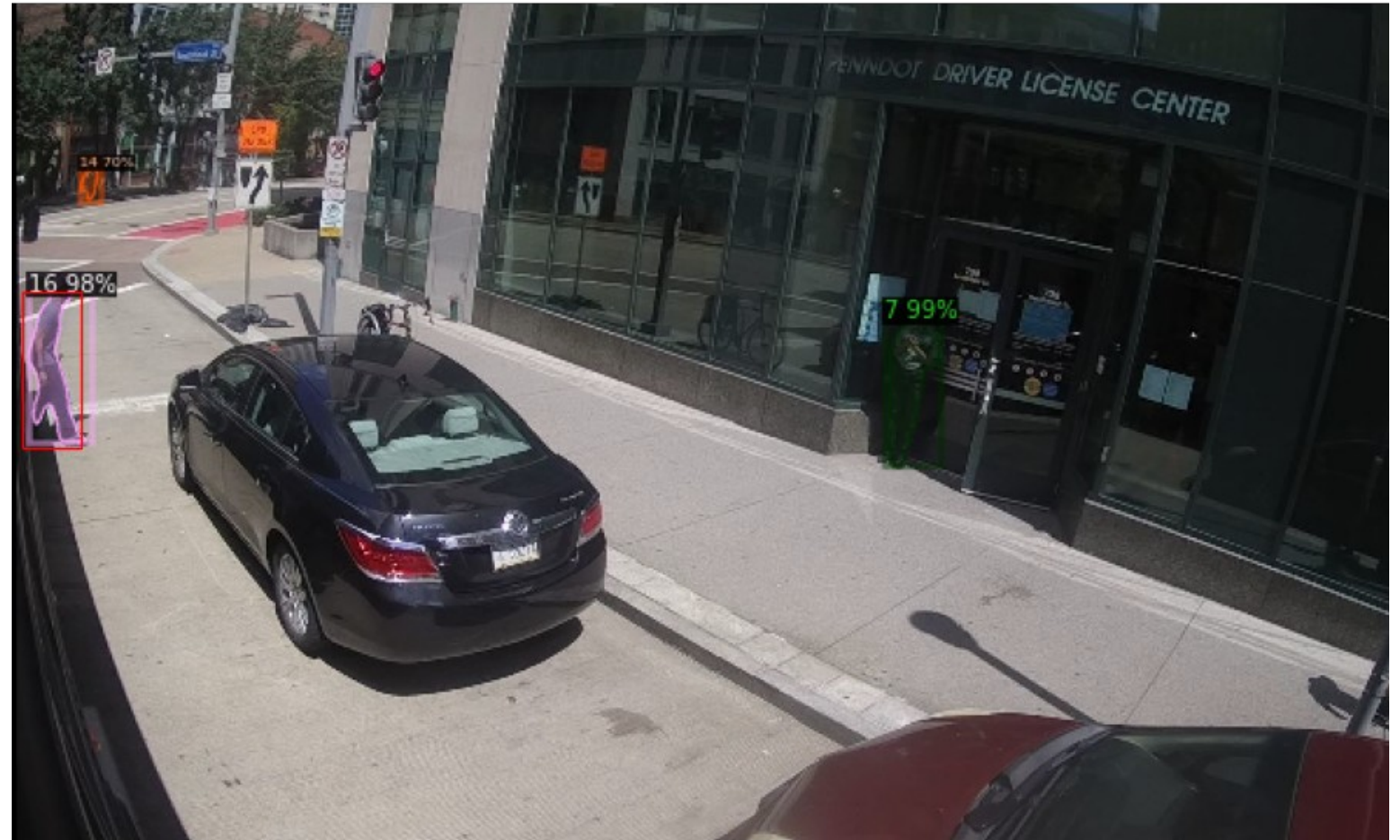
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**SEPTEMBER 30<sup>TH</sup>, 2021**

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# Overview

- Analyze data from bus between Washington and Pittsburgh
- Detect places where people enter and leave the bus
- Compare detected stop locations to GPS data of the listed bus stops



Human detection on bus camera footage



# Goals



Find locations where people enter without a bus stop

# Goals



Find errors in the data sheets with bus stop data



# Goals

- Gain information about the usage of the bus stops
- Gain live information about how full the bus is
- Gain information about passenger numbers
- Gain data about which hours are especially busy
- Gain information how utilization is influenced by external factors

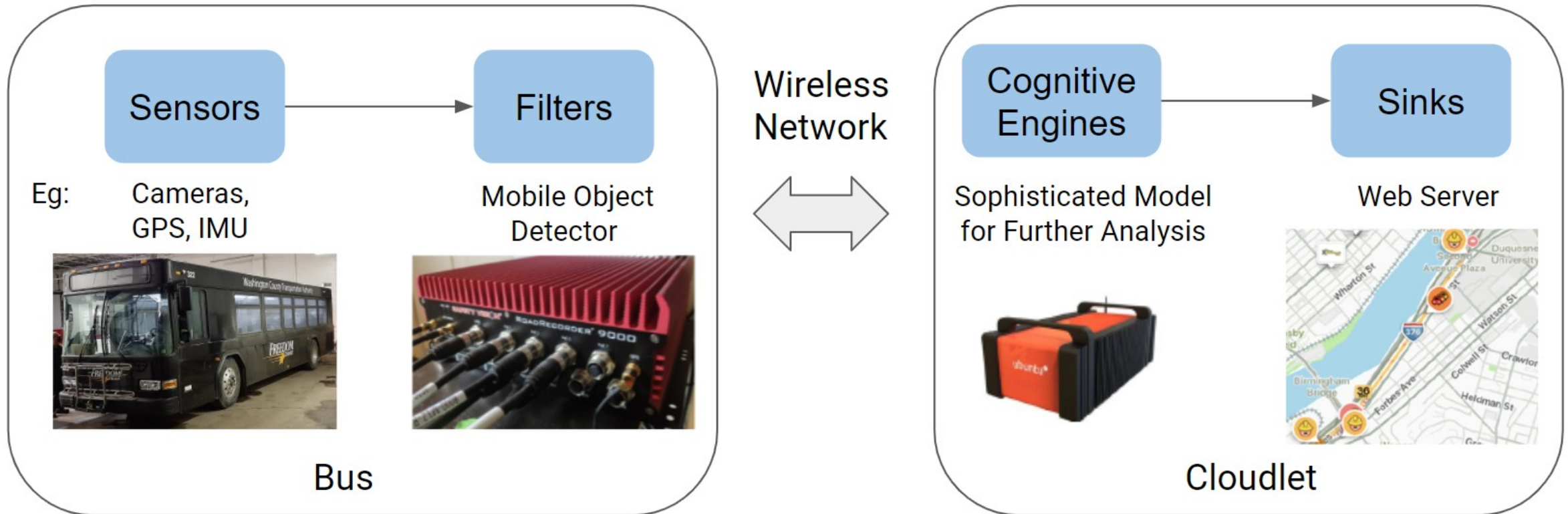


Symbols of the Deutsche Bahn to indicate the utilization of the trains

# How it is done

- Bus is equipped with cameras
- Humans in camera images get detected with DL / CV
- Humans get tracked
- Human positions get analyzed (e.g. proximity to door)
- Compare GPS data of detected bus stops with GPS data of official bus stops

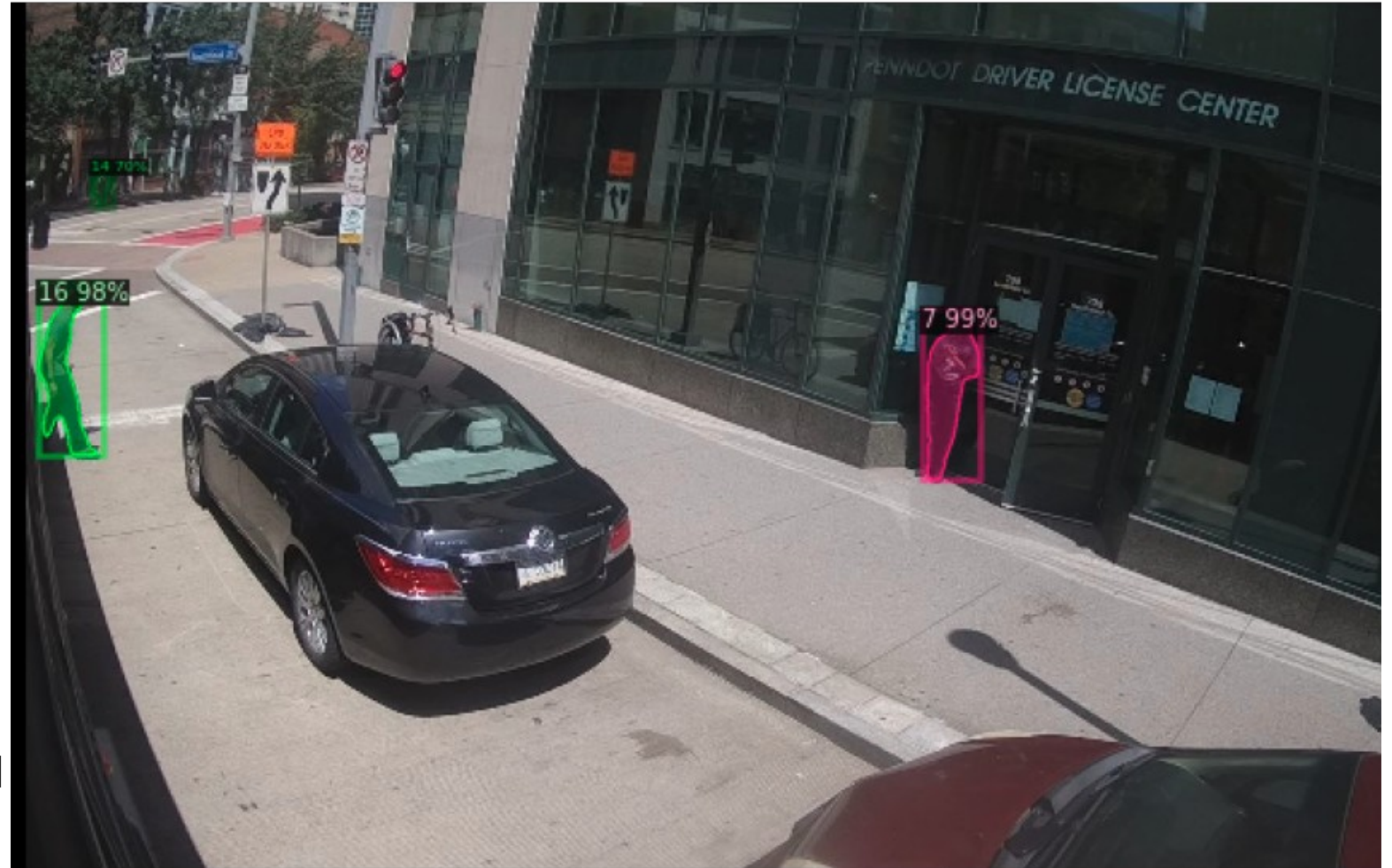
# The BusEdge System



<https://github.com/CanboYe/BusEdge>

# Human Detection

- Using Detectron2
- Algorithm detects 81 different classes and segments the instances
- Using R-CNN Network
- Detection is applied on each image individually
- Often Bus mirror or window of bus detected as human  
→ window got set to black and mirror detections get ignored

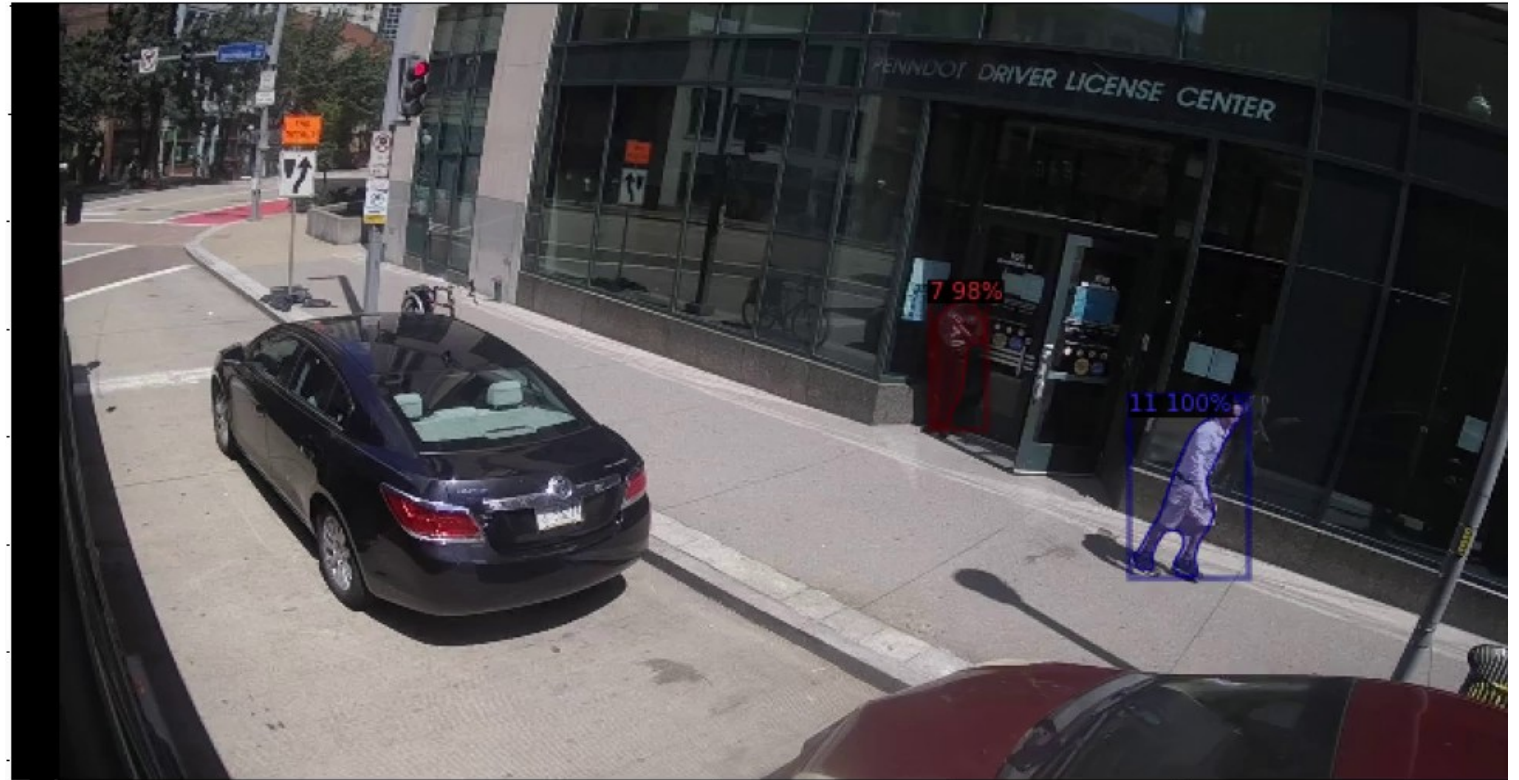


Detected and segmented humans in an image



# Human Tracking

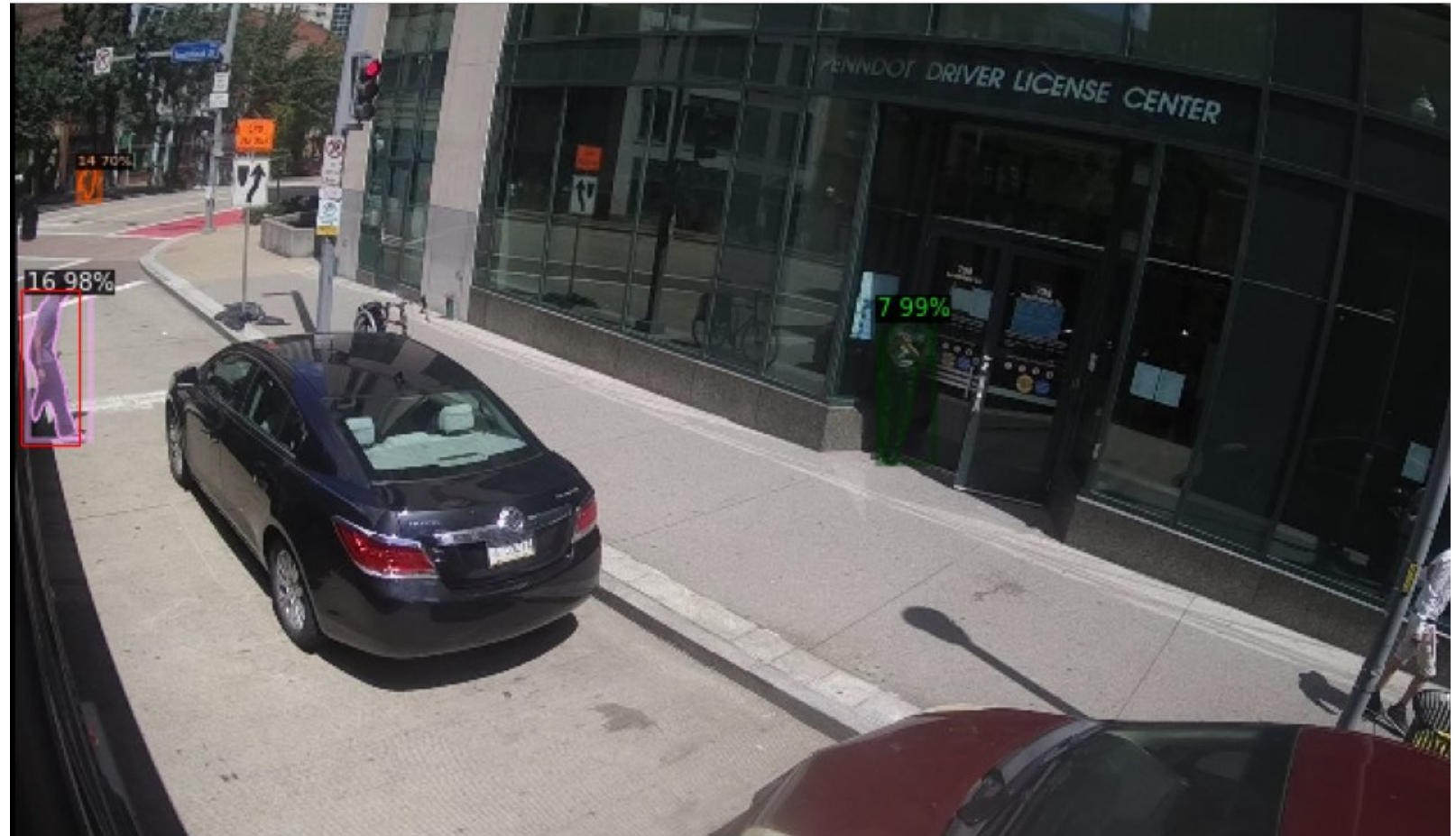
- Tracking based on Hungarian algorithm
- Using IoU (Intersection over Union)
- Reidentification possible



Tracking walking pedestrians

# Analyze Human Behavior

- Check if humans are near the door
- Classify humans based on if they enter or exit the area near the door

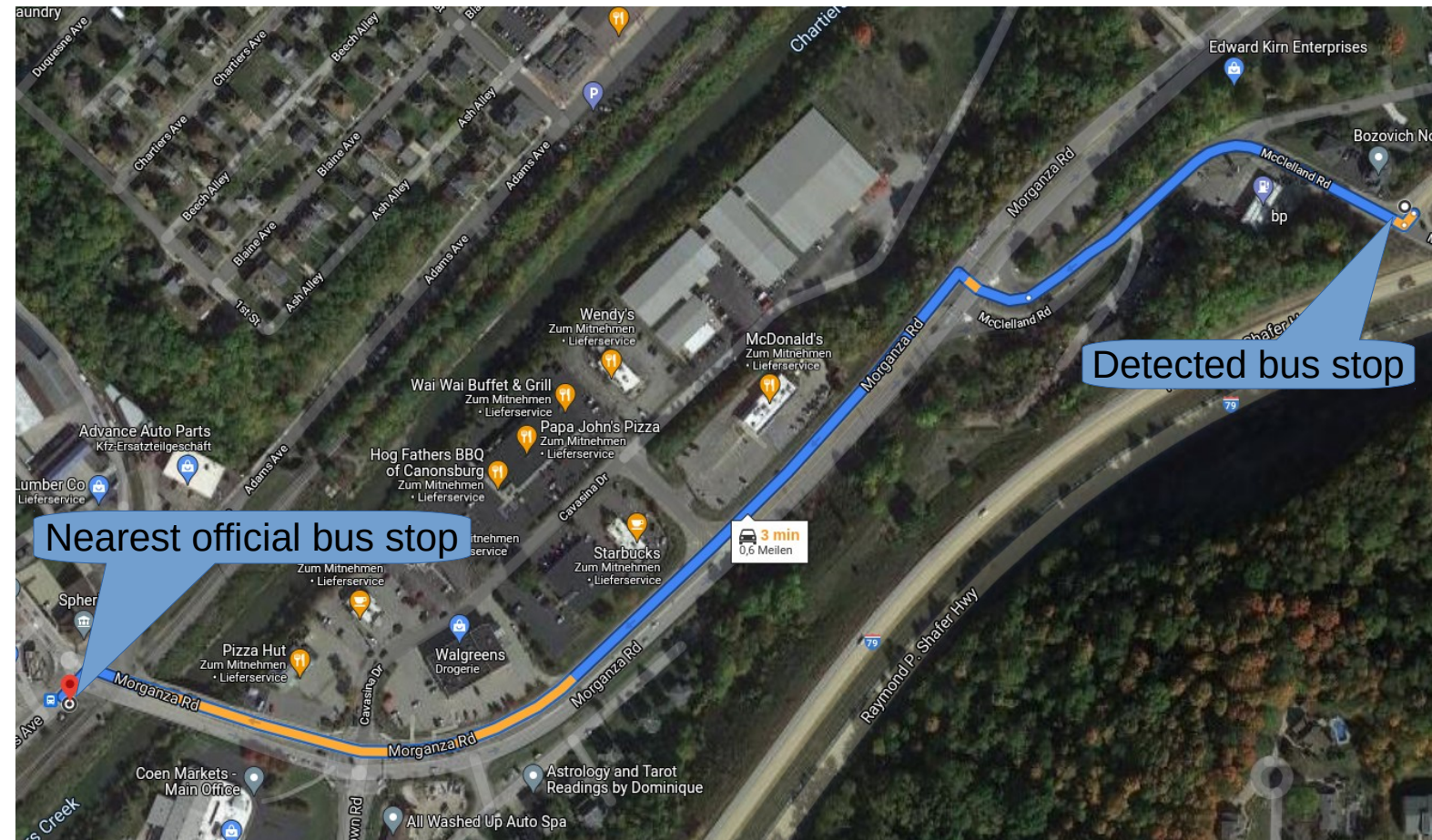


Example how a person is detected entering



# Compare GPS Data

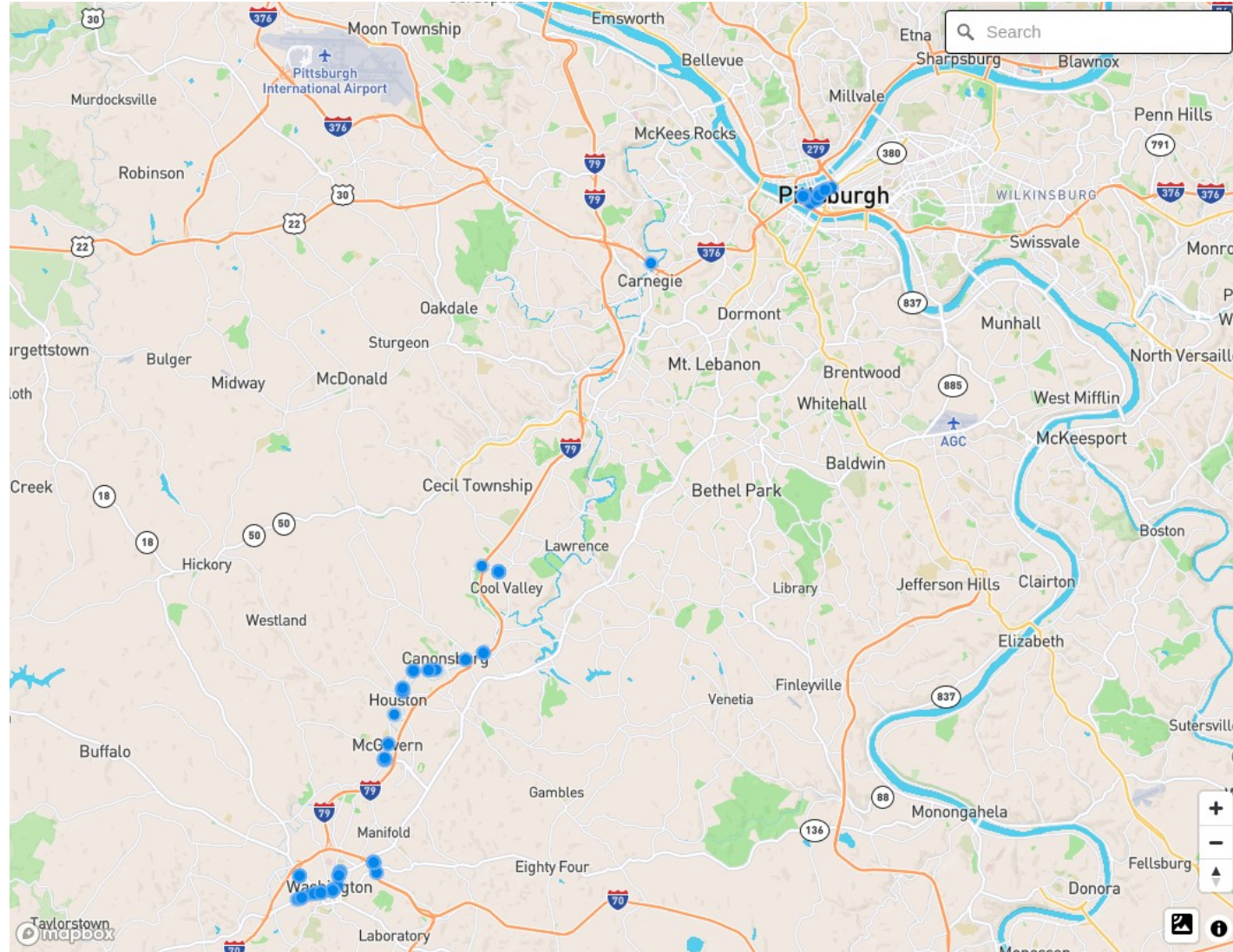
- Read out the GPS data from detected bus stops
- Compare with GPS data from all listed stops
- Pick the bus stop with the shortest distance to the detection
- If the distance is  $> 100\text{m}$ , predict that the person is not at a bus stop



Distance between a detected stop and the nearest official bus stop



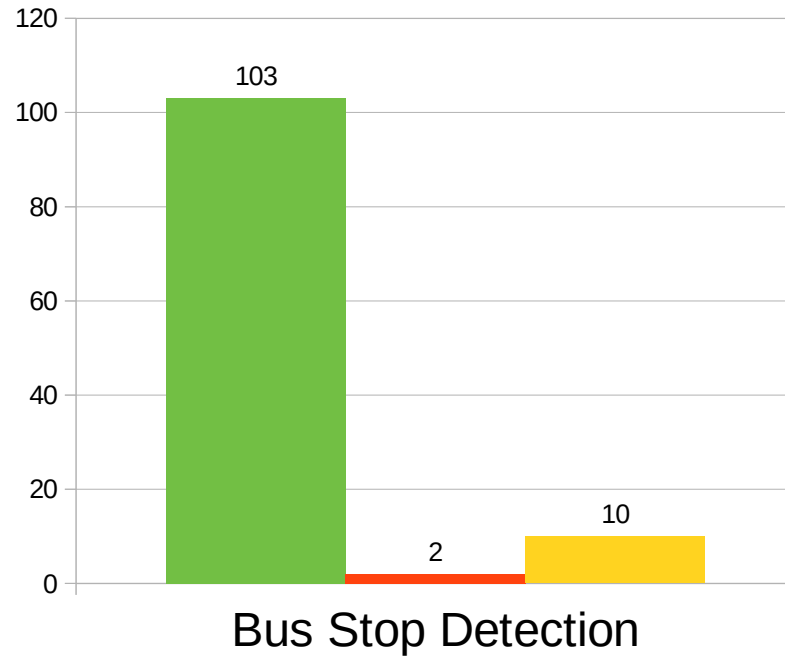
# Visualize Data



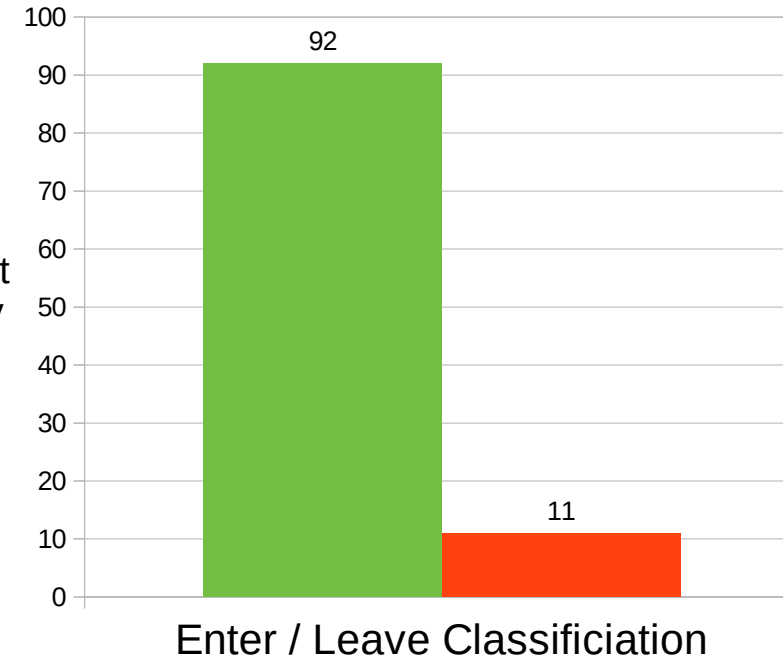
All detected busstop locations on a map

# Evaluation

- 9 datasets analyzed
- 96,750 images analyzed



■ Bus stops that got detected correctly  
■ Stops that were missclassified as busstops  
■ Missed bus stops



■ Correct Classifications  
■ False Classifications

# Detected Unofficial Bus Stops

- Out of 146 detected bus stops, 35 are not near an official stop
- **In 3 cases the data sheet is incomplete**
- Includes stops out of regular operation hours
- Mostly people exiting the bus
- Hard to tell if anyone was waving for the bus to stop



A bus stop sign exists, but no stop is listed for this location



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Bus driver refilling gas gets detected as an unofficial bus stop

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Persons exiting without an official bus stop



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Person possibly waving at the bus



# Future Plans

- Better integrate into BusEdge system
  - Try to run human detection on MobileNet
- Run detection algorithm on more test data

