

# Well what About us? Incorporating Humans and their Behaviour in a World of AEVs using VR!

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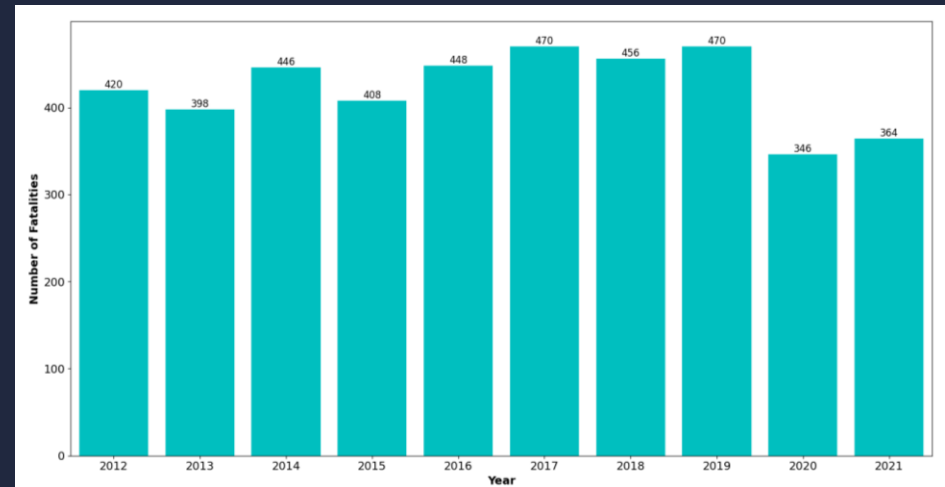


# Background

# Introduction

AVs have been lauded as the next stage in independent mobility but have been consistently delayed. This is partly due to the complexity of autonomous navigation of urban environments as a result of human-car interactions.

One major issue revolves around road-crossing events. There are several important elements, including predicting when pedestrians will cross into the road, their path, and the critical factors that can impact these variables.



## ● Previous Approaches

AV research topics have included trajectory and discrete road-crossing prediction. Recent efforts have identified the major unresolved questions within this area including suggesting that complex, multi-pedestrian scenarios are not yet fully understood, especially as there is more qualitative than quantitative data.

Machine learning approaches use numerous data sources for training machine learning models for trajectory prediction. Most common is the extraction of trajectory data from video footage. These data sources suffer from several limitations, such as the scope of the camera's viewport, limiting spatial and temporal data.

## Previous Approaches to pedestrian-AV interaction

Interaction between pedestrians and automated vehicles: A Wizard of Oz experiment (Palmeiro et al. 2017) – not VR

i) Clamann et al. (2017) experimentally investigated pedestrians' response times to a Wizard of Oz AV carrying a forward facing sign that showed a message (e.g., 'Walk', 'Do not walk'). Found legacy behaviors, such as gap distance, are more important for pedestrians in deciding whether to cross the road than the message displayed on the AV.

ii) Malmsten Lundgren et al., (2017) participants' willingness to cross was assessed while encountering a traditional vehicle or a Wizard of Oz AV. recommended that it may be beneficial to provide information to pedestrians by means of an external vehicle display.

Kitazaki and Myhre (2015), interviews provided a list of eight tentative recommendations for communication between pedestrians and AVs, e.g. recommended that autonomous vehicles should identify themselves on the body of the vehicle so that others can form an understanding and trust in AVs.



# Experimental Data Collection

- Participant Recruitment
  - 97 participants
  - 17 sessions
  - 3-13 people in groups
  - December 2021
  - Walk-in-place locomotion
  - Multiplayer setup
  - Asked to cross road, reach twenty green points
  - Must start again if hit by a car

# ● VR Environment

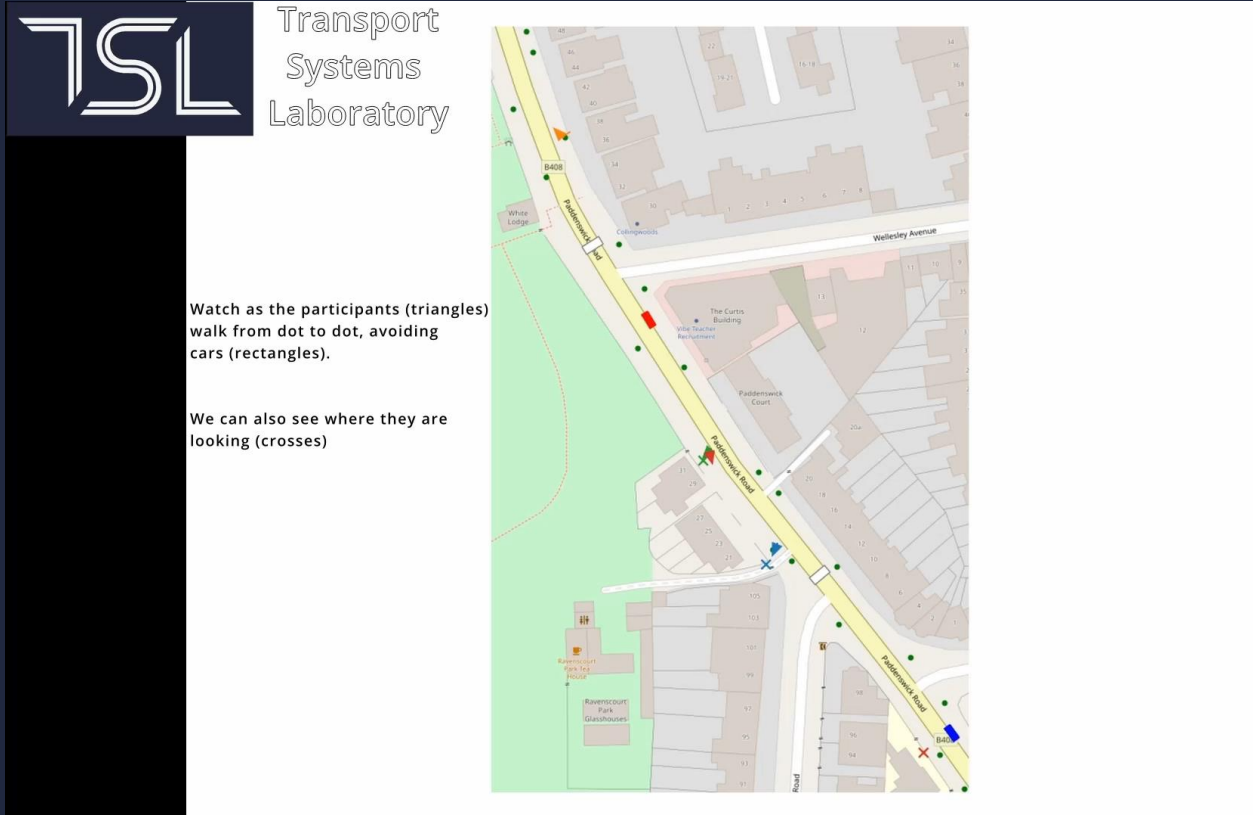




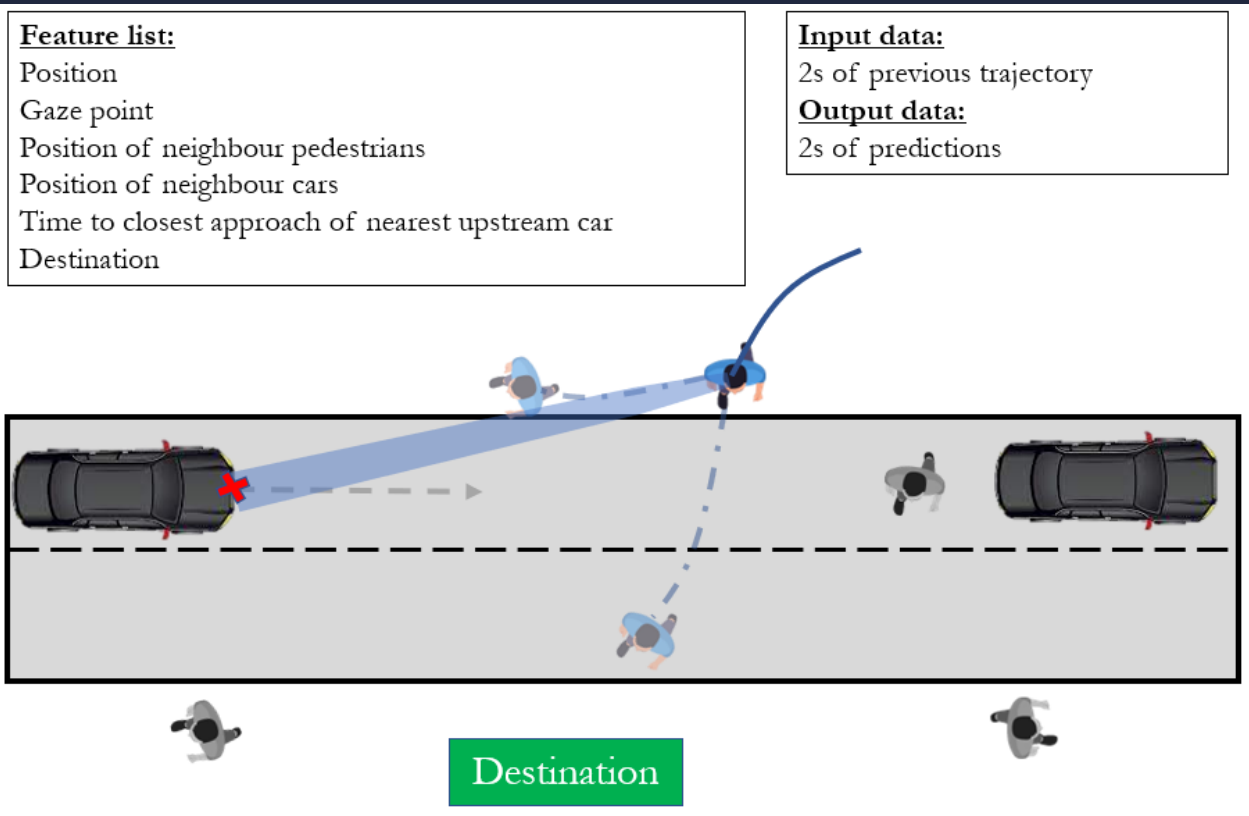


# Data Preparation

# Data Visualisation



# ● Feature Parameters



## ● Data Cleaning

- Isolate road crossing events
- Extract 4s data (2s before, 2s after)
- For each crossing event, data of all participants within the scene are exported



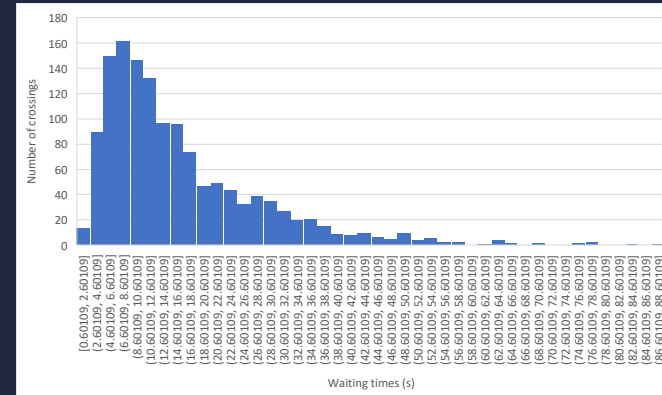
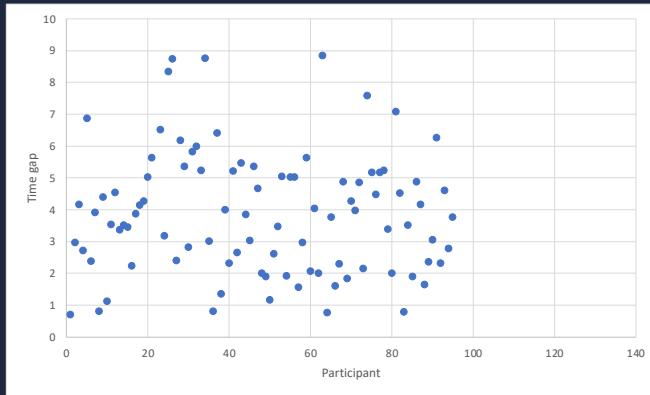
# Results & Discussion

# Time gaps

Minimum time gap accepted by participants is 0.7 seconds.

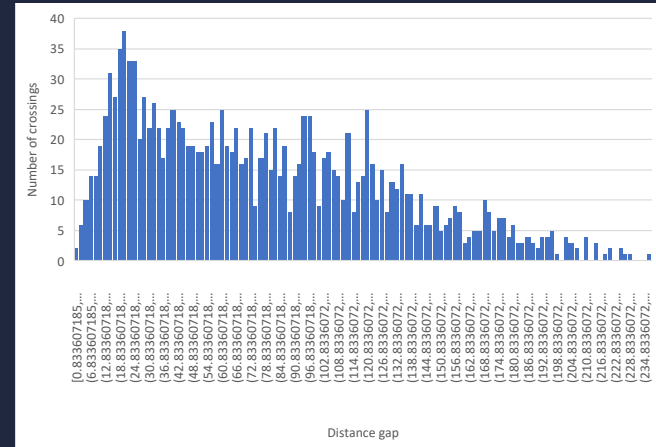
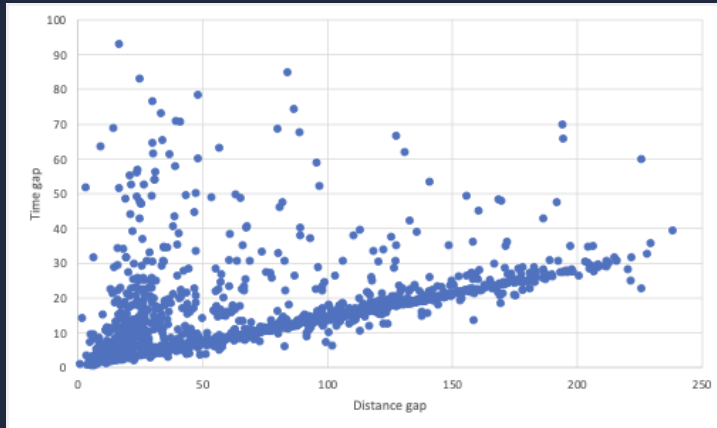
Minimum gap accepted by everyone (maximum of minima) is 8.84 seconds.

As the size of the gap available increases, people will be more likely to accept it. (2021).



# Distance Gaps

- Most people cross at lower vehicle speeds (2-4) mainly and (0-2)
- As vehicle speed increases, the maximum time gap accepted by participants decreases
- Participants seem to use the distance separating them from the vehicle rather than its speed to determine whether it is safe to cross

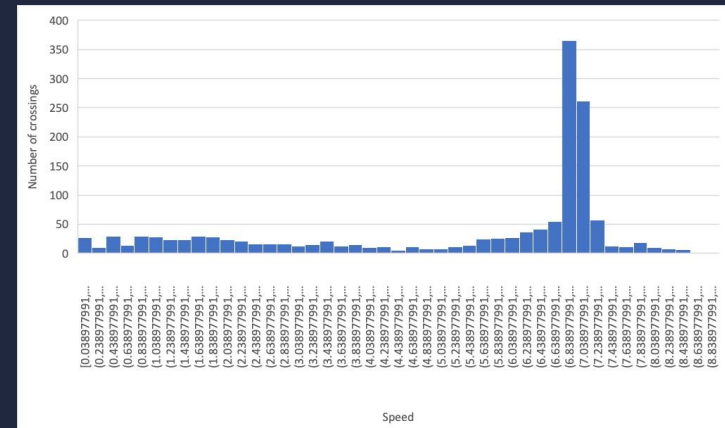
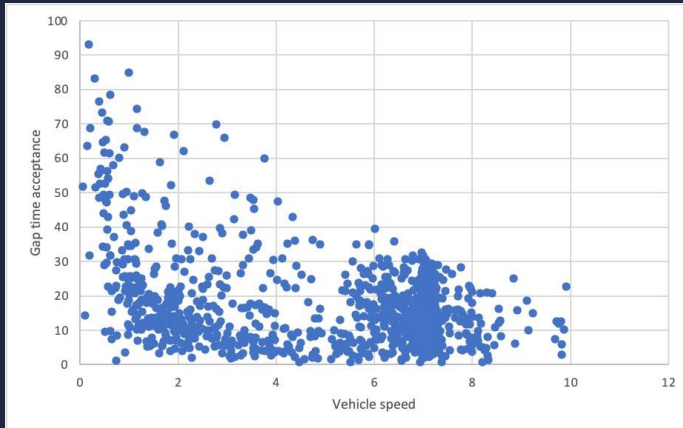


# ● Vehicle Speed

Upto 24 meters gap people tend to cross more as the gap increases. Then willingness to cross decreases

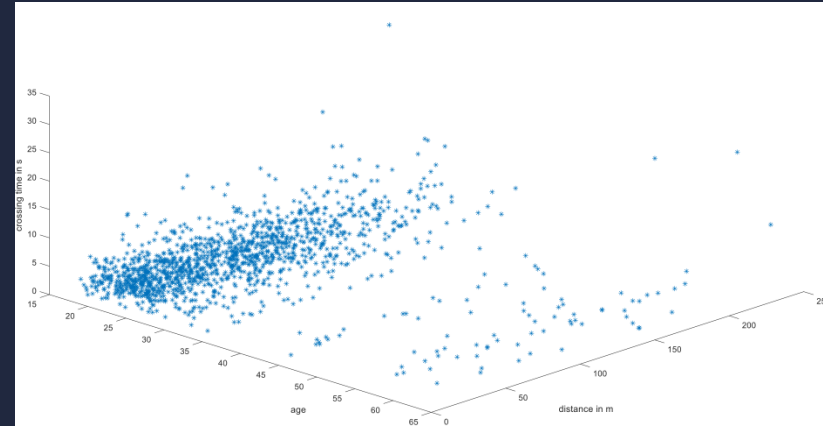
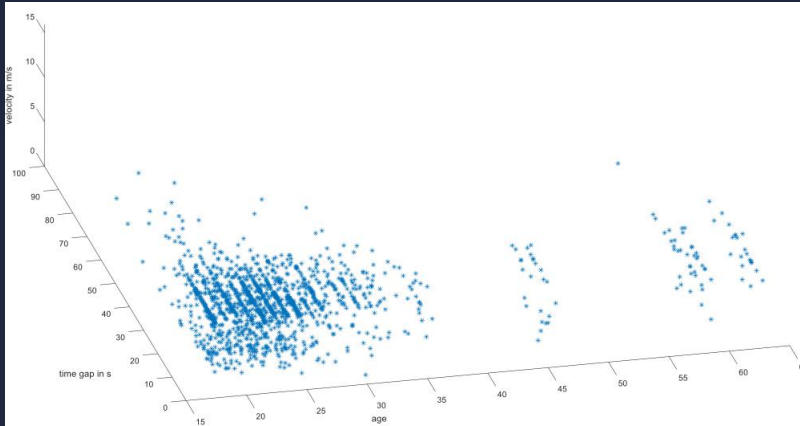
0.365 correlation coefficient between time gap and distance gap accepted by pedestrians

0.52 correlation coefficient between distance gap accepted and vehicle speed





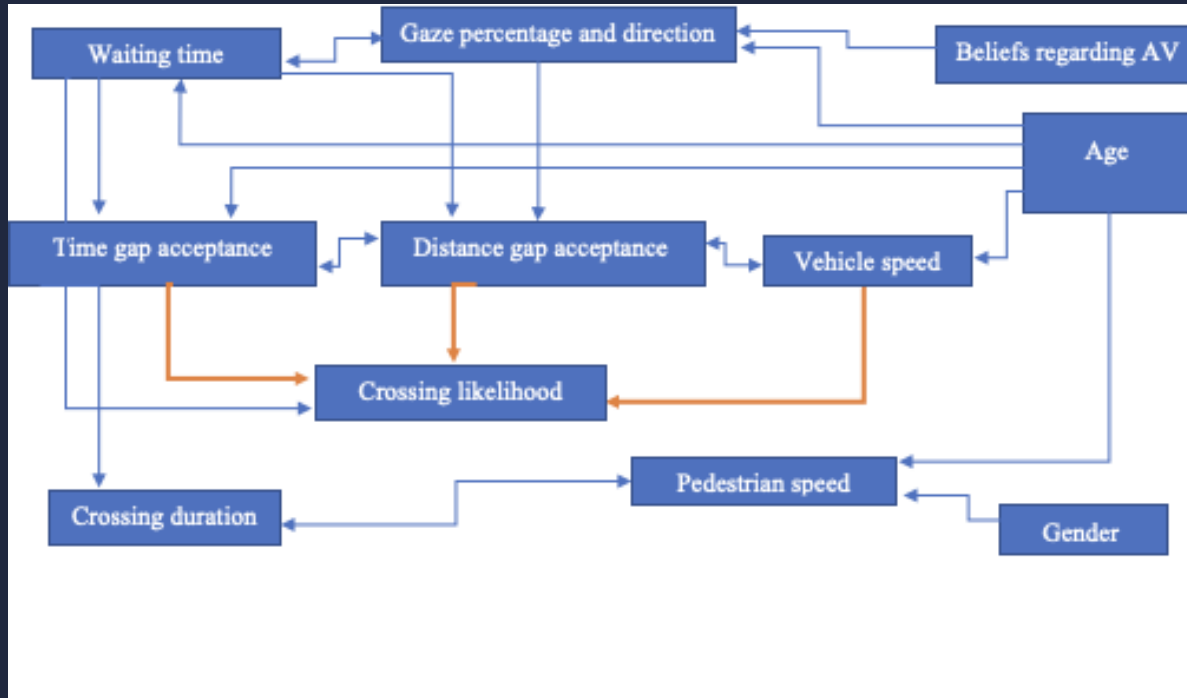
# • Gaps effects with age



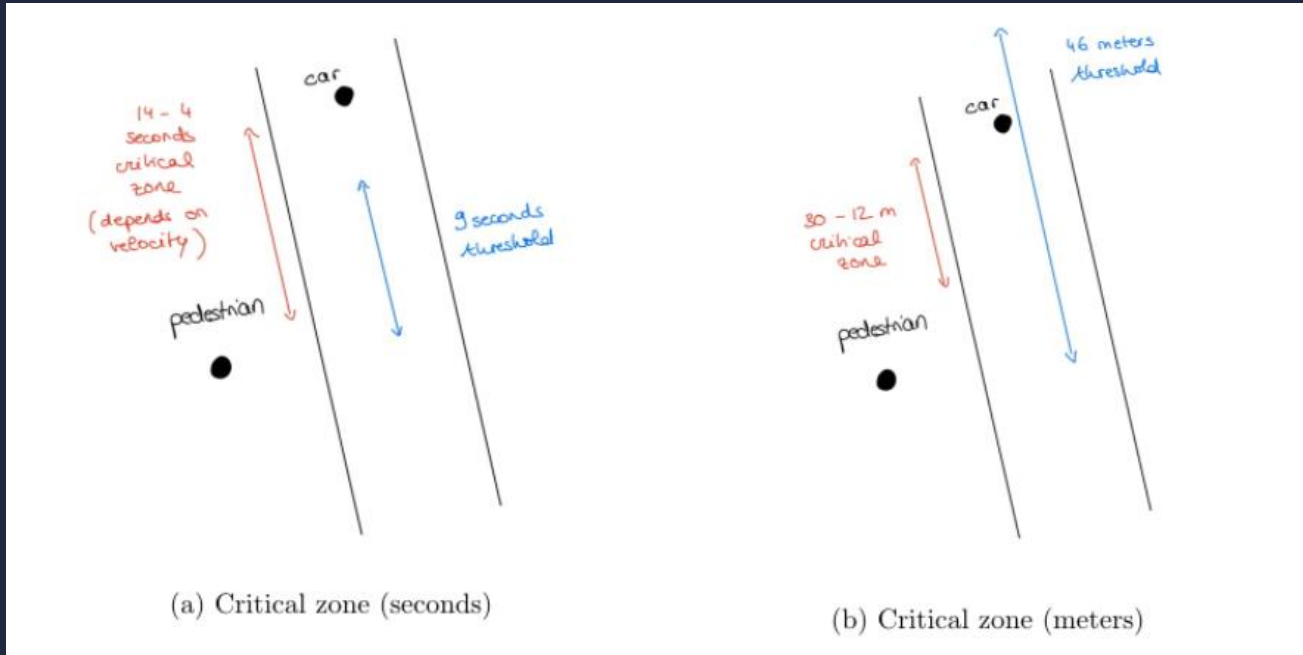


# Conclusion

# Proto-type model of crossing decision



# ● Critical Zone for pedestrian safety



- Also AVs with visual indicators?

## ● Contributions

- Develop a VR environment for pedestrian – AV interactions
- Focus on semi-rural AV-Pedestrian interactions
- Present a new, complete dataset for pedestrian-AV interaction

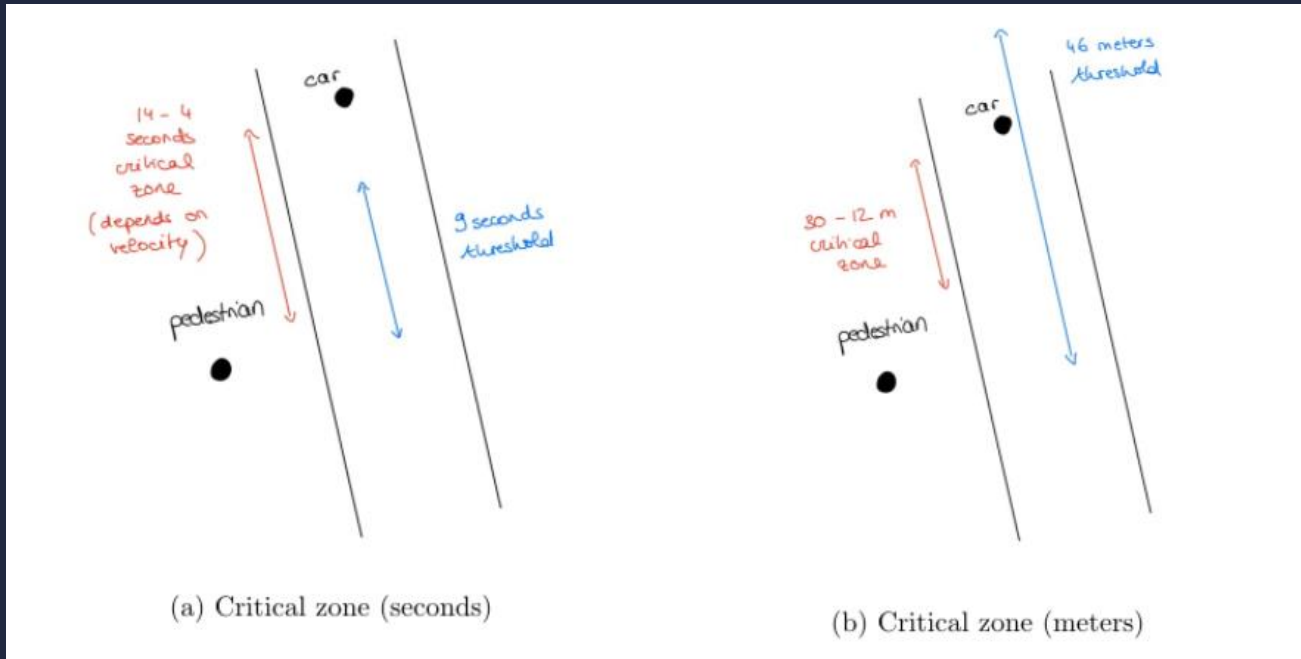
- Future experiments Feb 2024 onwards
  - In semi-rural area, when the design of road crossing facilities includes the decision of type and location which depend on: 1) pedestrian traffic needs (decided by population density, road types, pedestrian traffic, and nearby destinations), 2) road widths, 3) traffic volume, 3) speed limits, and 4) visibility.
  - The types include: zebra crossings, pedestrian islands, raised crosswalks, zebra crossings with traffic signal.
  - If zebra crossings or pedestrian islands (without signals) are selected, then, traffic calming facilities should be designed to protect pedestrian safety.
  - The experiment results have an implication on the design of traffic calming facilities:

## ● Current and future experiments

- In semi-rural area, design of road crossing facilities includes the decision of type and location which depend on:
  - 1) pedestrian traffic needs (decided by population density, road types, pedestrian traffic, and nearby destinations),
  - 2) road widths,
  - 3) traffic volume,
  - 4) speed limits, and
  - 5) visibility.

# Experimental results

- The experiment results have an implication on the design of traffic calming facilities:


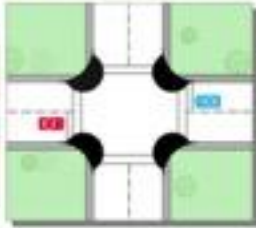


- Using the critical zones => convert to designs



# Possible Traffic Calming Approaches

### BULBOUT/POP-OUT/CURB EXTENSION

**Primary Purpose:**  
**SPEED REDUCTION**

On: Residential, Collector, Major

**Other Potential Results:**  
**VOLUME REDUCTION**  
**PEDESTRIAN SAFETY**  
**COLLISION REDUCTION**

**Cost:** **HIGH**  
 (\$40,000 to \$80,000 per intersection;  
 4 bulbouts total)

MEASURED EFFECTIVENESS	
Speed Reduction <sup>1</sup>	-7%
Volume Reduction <sup>2</sup>	-10%
Collision Reduction <sup>3</sup>	1/10 <sup>4</sup>

Source: Traffic Calming - State of the Practice 2000  
<sup>1</sup>Reduction in 85th Percentile Speeds between stop points  
<sup>2</sup>Reduction in Vehicles per Day  
<sup>3</sup>Reduction in Average Annual Collisions  
<sup>4</sup>TIC-Insight Data to predict reduction effect

### RAISED CROSSWALK




**Primary Purpose:**  
**SPEED REDUCTION**

On: Residential, Collector

**Other Potential Results:**  
**VOLUME REDUCTION**  
**PEDESTRIAN SAFETY**

**Cost:** **MEDIUM**  
 (\$25,000 to \$35,000)

MEASURED EFFECTIVENESS	
Speed Reduction <sup>1</sup>	-18%
Volume Reduction <sup>2</sup>	-12%
Collision Reduction <sup>3</sup>	-45%

Source: Traffic Calming - State of the Practice 2000  
<sup>1</sup>Reduction in 85th Percentile Speeds between stop points  
<sup>2</sup>Reduction in Vehicles per Day  
<sup>3</sup>Reduction in Average Annual Collisions

- Designs to be tested



• Thank you!

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