

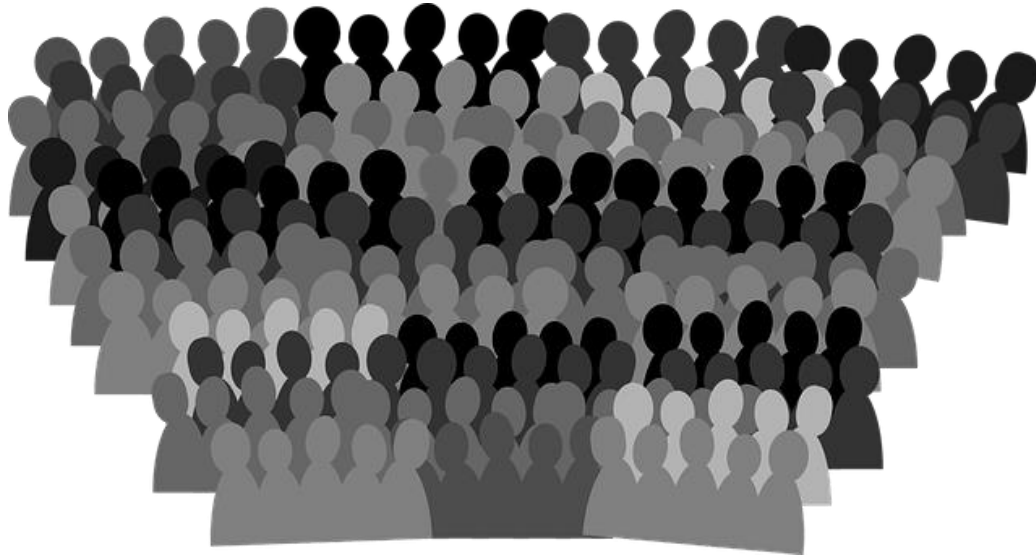
# Simulation study on evacuation strategy for Vulnerable pedestrians

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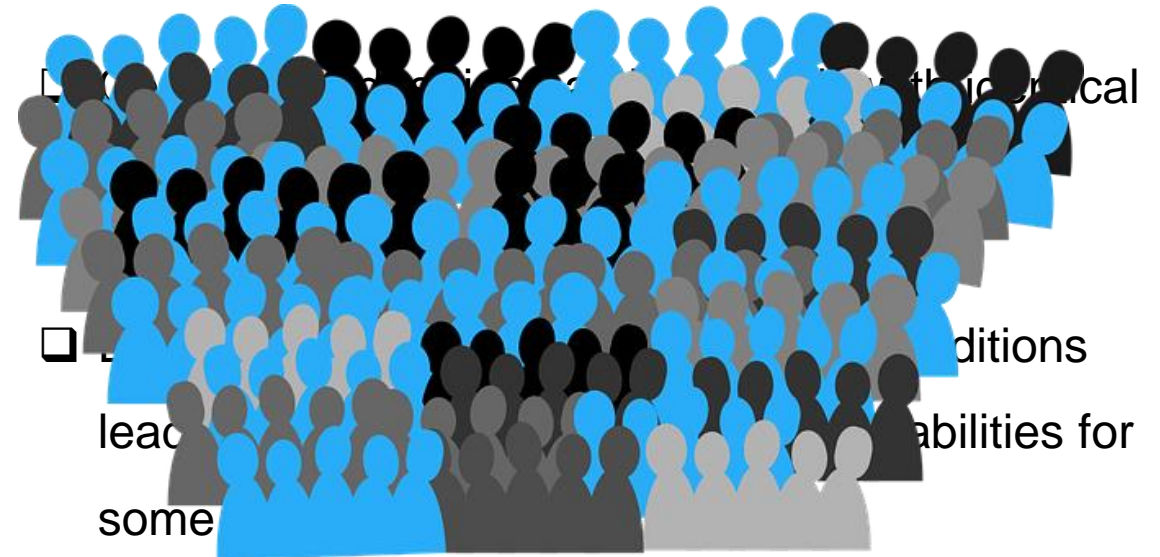
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# Motivation

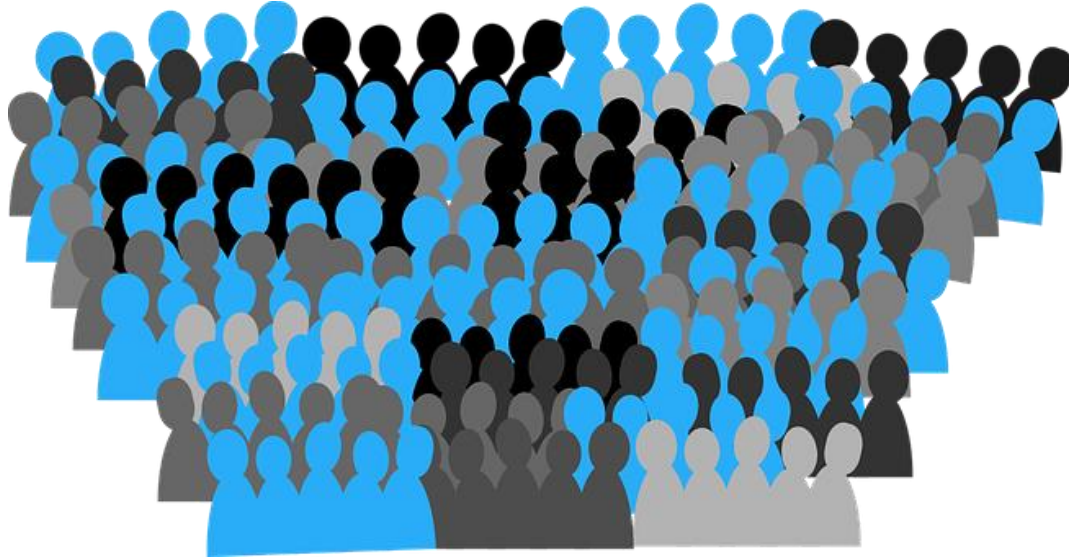


Individuals with identical characteristics



Vulnerable pedestrians are involved

# Research questions



- Can we develop evacuation strategy for helping vulnerable pedestrians?
- What factors affect the effectiveness of the strategies we developed?

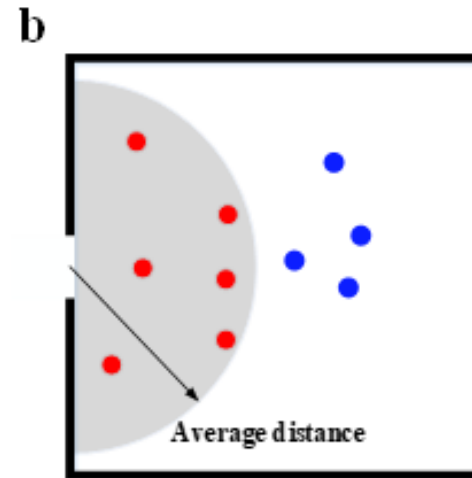
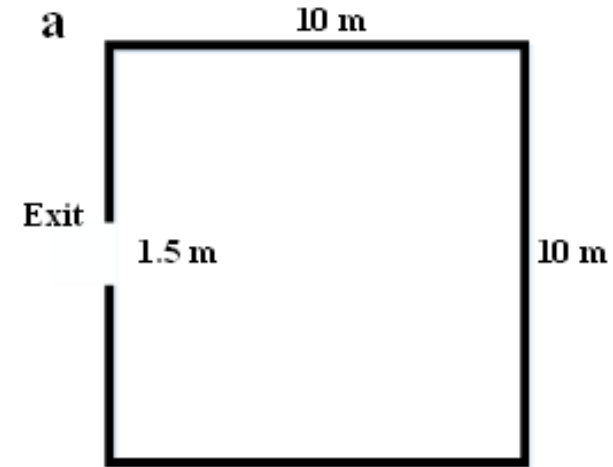
**Not Focus on:**

The mechanism behind pedestrian behaviors

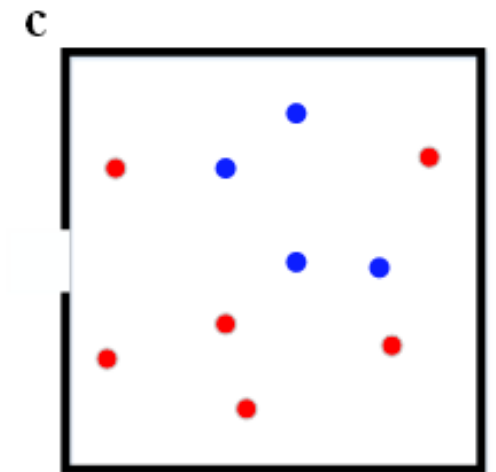
Seeking the optimal strategy

# Vulnerability

- Distance-based vulnerable pedestrians  
who are further away from exits  
-- depends on pedestrian initial distribution
- Velocity-based vulnerable pedestrians  
who have lower speeds  
-- pre-assigned



Distance-based



Velocity-based

# Strategies at different evacuation stages

## pre-evacuation stage

- allowing vulnerable pedestrians to respond quickly

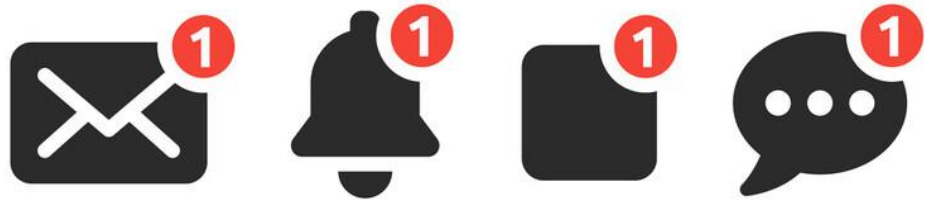
## response stage

- giving vulnerable pedestrians priority for exit assignment

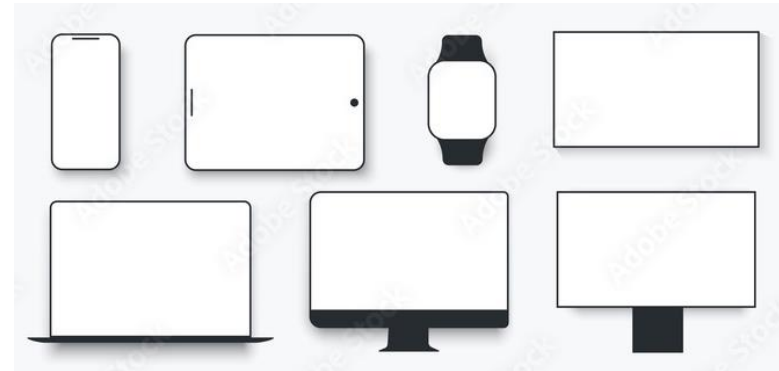
## evacuation phase

- placing an obstacle in front of exits

# Strategies at different evacuation stages



Notified with 100% accuracy



Modern devices

# Modelling

## Social force model

🔥 Driving force:

$$m_i \frac{d\mathbf{v}_i}{dt} = m_i \frac{v_i^0(t) \mathbf{e}_i^0(t) - \mathbf{v}_i(t)}{\tau_i} + \sum_{j \neq i} \mathbf{f}_{ij} + \sum_W \mathbf{f}_{iW}$$

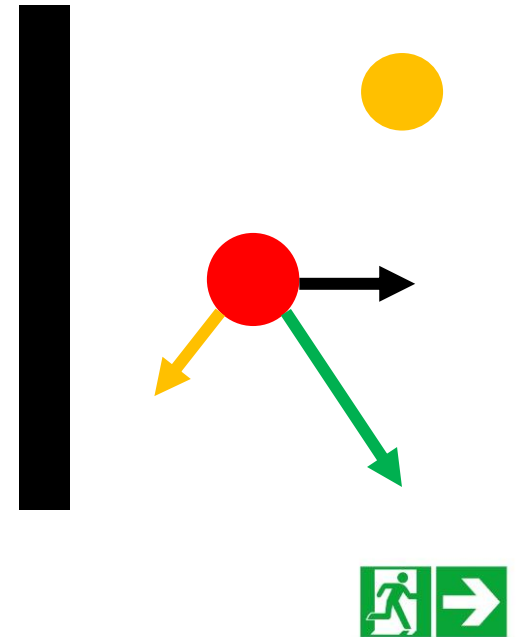
🔥 Interactions with wall

$$\mathbf{f}_{ij} = \{A_i \exp[(r_{ij} - d_{ij})/B_i] + kg(r_{ij} - d_{ij})\} \mathbf{n}_{ij} + \kappa g(r_{ij} - d_{ij}) \Delta v_{ij}^t \mathbf{t}_{ij}$$

🔥 Interactions with others

$$\mathbf{f}_{iW} = \{A_i \exp[(r_i - d_{iW})/B_i] + kg(r_i - d_{iW})\} \mathbf{n}_{iW} + \kappa g(r_j - d_{iW}) (\mathbf{v}_i \cdot \mathbf{t}_{iW}) \mathbf{t}_{iW}$$

Wall



# Strategies at different evacuation stages

## pre-evacuation stage

- allowing vulnerable pedestrians to respond quickly

## response stage

- giving vulnerable pedestrians priority for exit assignment

## evacuation phase

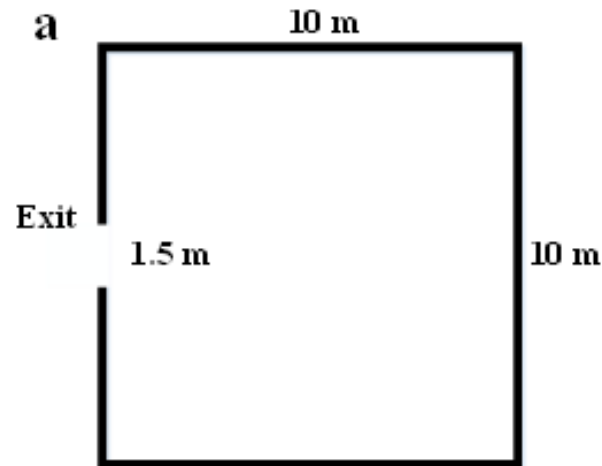
- placing an obstacle in front of exits



# Example 1: Allowing vulnerable pedestrians to respond quickly

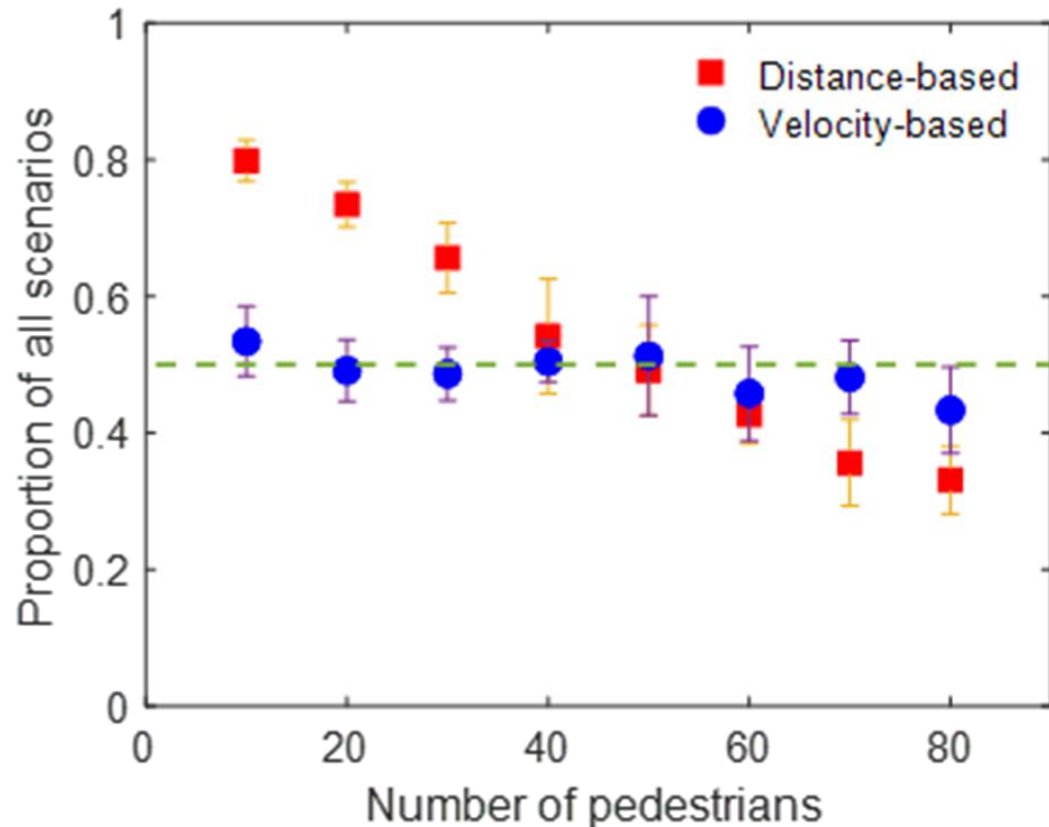
## 1. Example 1: pre-evacuation stage

- pedestrians have not begun evacuation strategy
  - allowing vulnerable pedestrians to respond quickly
- ✓ Quick-response strategy: vulnerable pedestrian can move earlier
  - ✓ Normal strategy: randomly selected equivalent number of pedestrians can move earlier



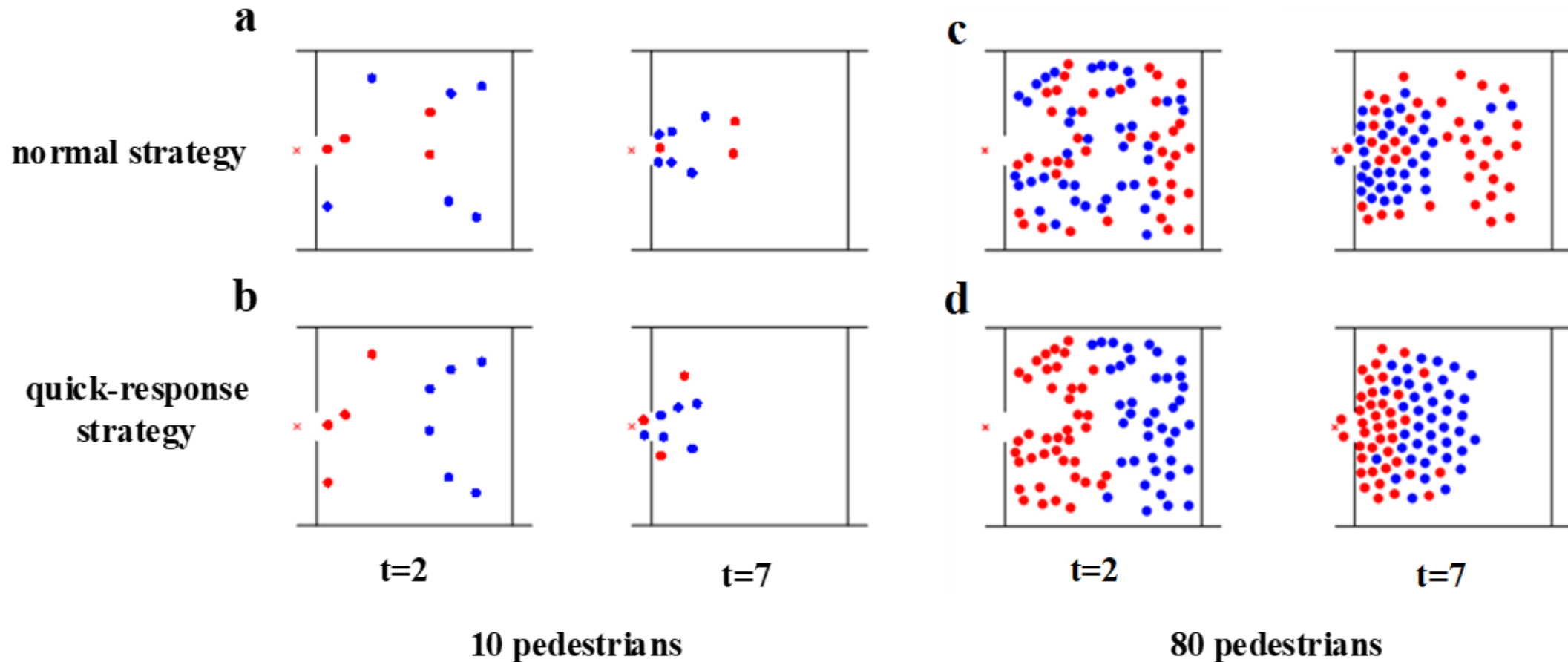
- ✓ Pedestrians are randomly distributed (1000 trails)
- ✓ Sceneries with 20% velocity-based vulnerable pedestrians
- ✓ Sceneries with distance-based vulnerable pedestrians

# Example 1: Allowing vulnerable pedestrians to respond quickly



- ✂ No effects on scenarios with velocity-based pedestrians.
- ✂ Beneficial for crowd evacuation when distance-based pedestrians are involved.
- ✂ The effectiveness decreases as the crowd size increases.

# Example 1: Allowing vulnerable pedestrians to respond quickly



# Strategies at different evacuation stages

## pre-evacuation stage

- allowing vulnerable pedestrians to respond quickly

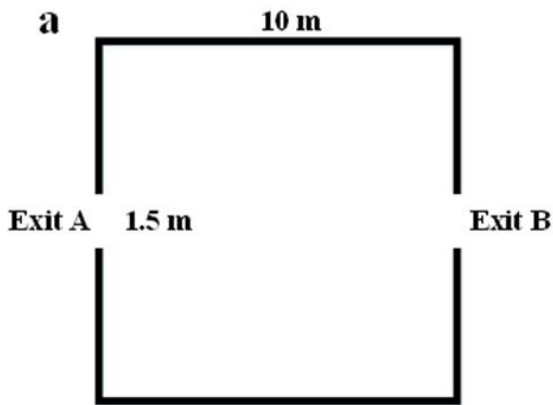
## response stage

- **giving vulnerable pedestrians priority for exit assignment**

## evacuation phase

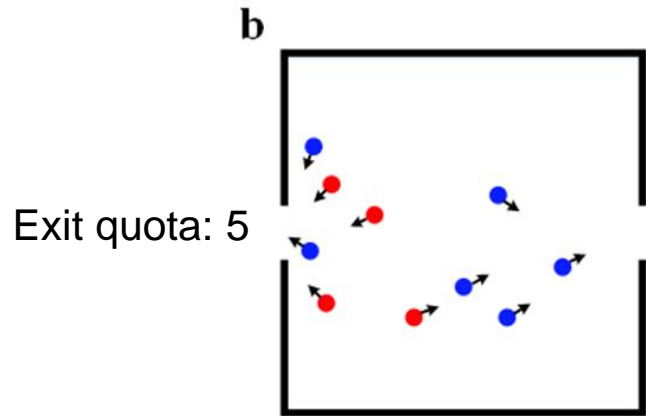
- placing an obstacle in front of exits

# Example 2: Giving vulnerable pedestrians priority for exit assignment

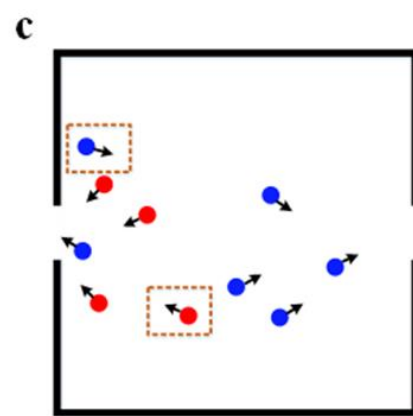


## Assumptions

- ✂ Evacuation resources are limited
- ✂ Each exit has a quota indicating maximum number of pedestrians can be evacuated
- ✂ Subsequent pedestrians have to take suboptimal exit if their preferred exit has been completely used.



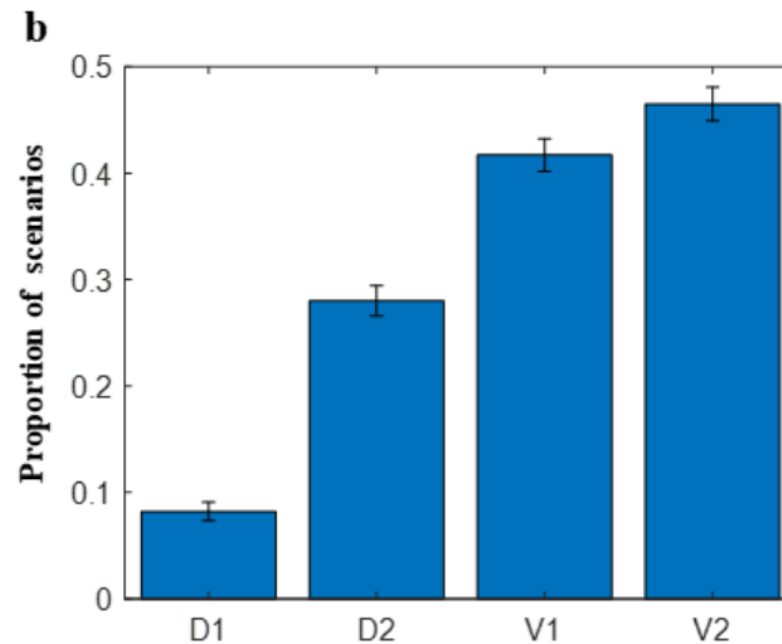
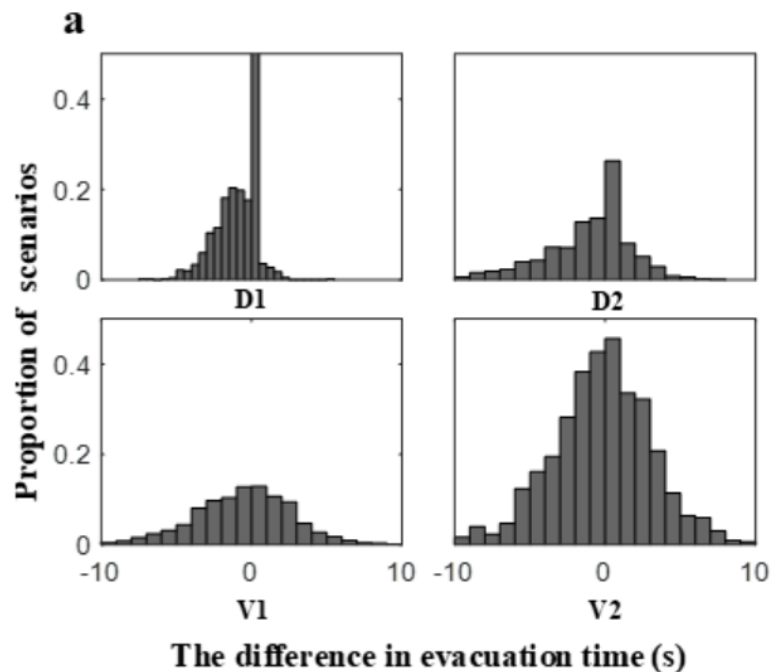
Normal strategy



Priority strategy

# Example 2: Giving vulnerable pedestrians priority for exit assignment

Scenario name	Vulnerability	Vulnerability proportion	Crowd size
D1	Distance-based	\	10
D2	Distance-based	\	50
V1	Velocity-based	0.2	50
V2	Velocity-based	0.5	50



# Example 2: Giving vulnerable pedestrians priority for exit assignment

Prediction accuracy of different methods for four scenarios. The highest accuracy in each scenario is in bold.

Methods/Scenarios	D1	D2	V1	V2
Coarse tree	84.8	61.2	55.5	49.8
Linear discriminant	87.1	59.5	54.0	50.1
Logistic regression	<b>87.3</b>	59.8	53.9	51.2
Kernel naïve Bayes	<b>87.3</b>	64.9	<b>56.9</b>	<b>51.8</b>
Linear SVM	<b>87.3</b>	64.6	54.4	51.1
Course KNN	86.8	<b>65.4</b>	<b>56.9</b>	49.6

# Strategies at different evacuation stages

## pre-evacuation stage

- allowing vulnerable pedestrians to respond quickly

## response stage

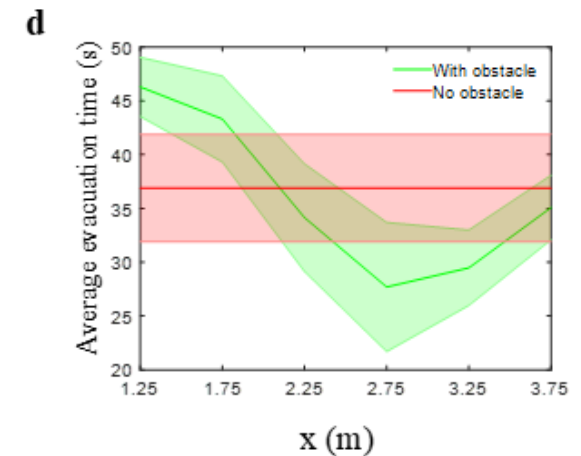
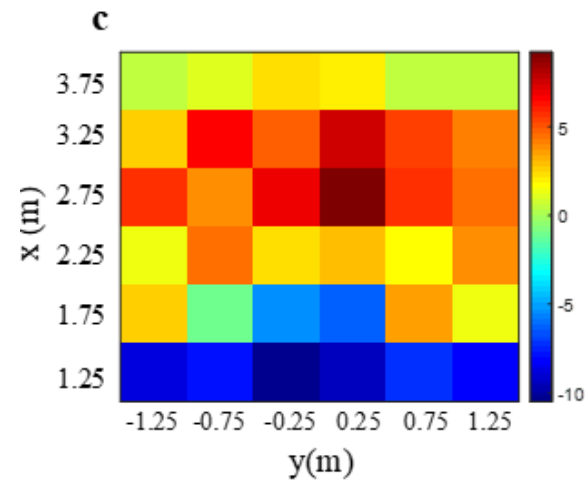
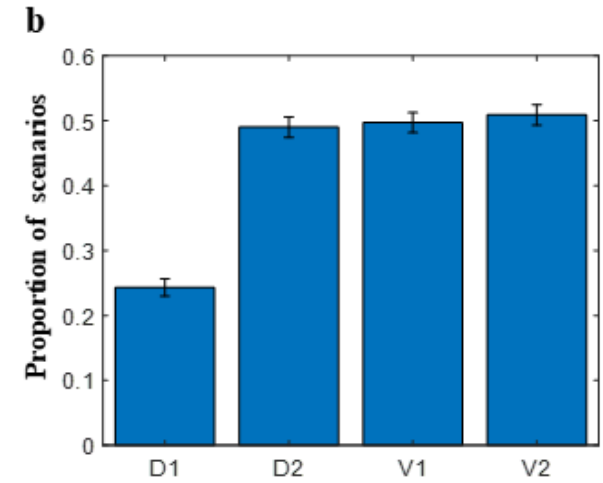
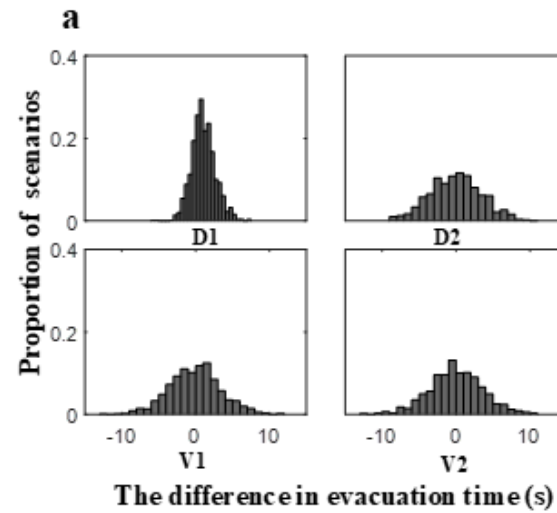
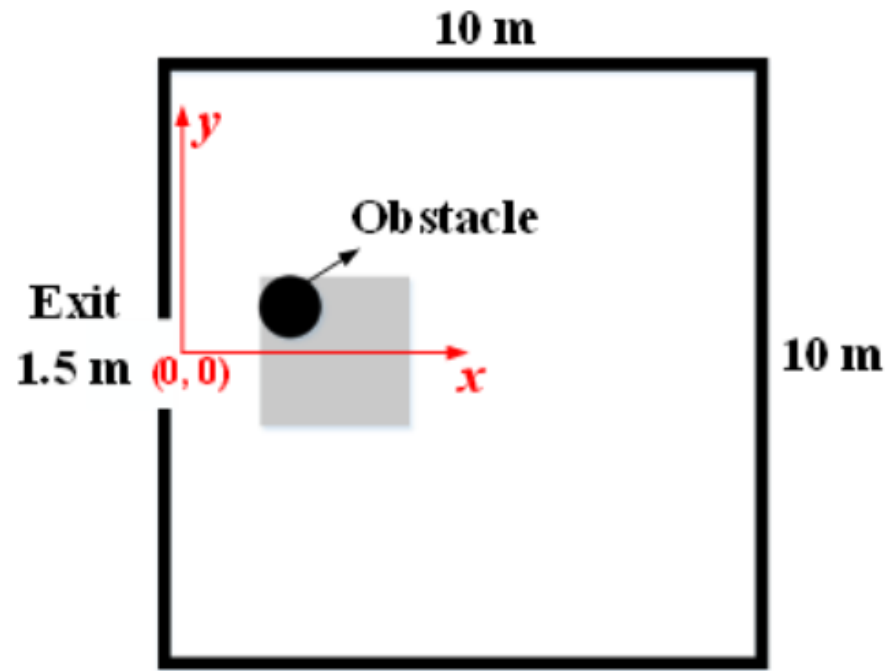
- giving vulnerable pedestrians priority for exit assignment

## evacuation phase

- **placing an obstacle in front of exits**



# Example 3: Placing an obstacle in front of exits



# Summary

- ❑ Can we develop evacuation strategy for helping vulnerable pedestrians?

**Yes, we can develop strategies in different evacuation stages, but they can only work in certain scenarios for certain vulnerable pedestrians.**

- ❑ What factors affect the effectiveness of the strategies we developed?

**The potential of strategies to improve evacuation efficiency depends on the context (e.g., crowd size and pedestrian initial distribution)**

**Thank you for attention!**

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