



# Driver Behavior Model to Define a Preventable Boundary for Scenario-based Safety Evaluation of Automated Driving

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# 1. Introduction

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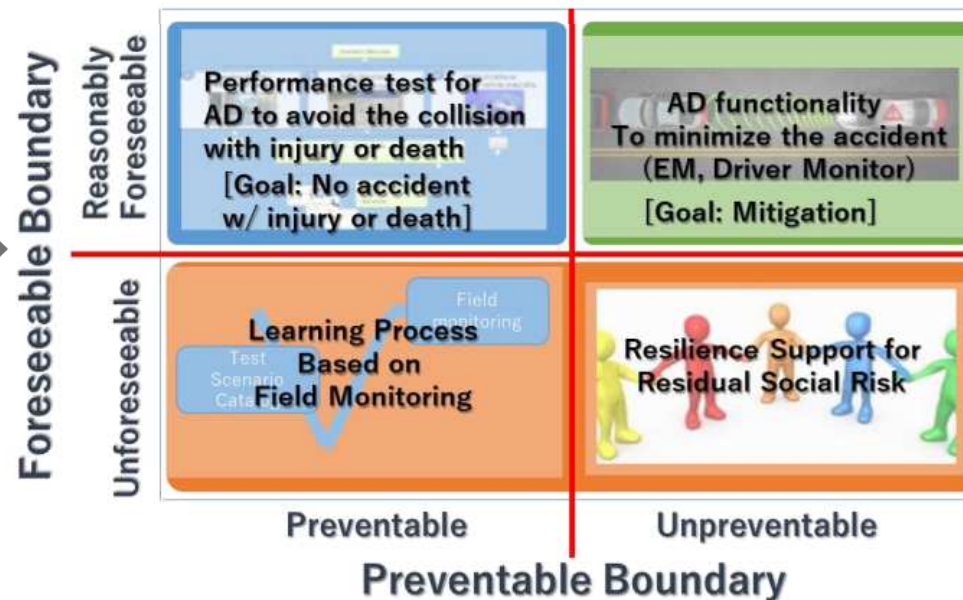
# Scenario-based safety evaluation of ADSs

## UN WP29 & MLIT



Automated Driving Systems, under their automated mode, shall not cause any traffic accidents resulting in injury or death that are reasonably foreseeable and preventable.

Foreseeability and preventability matrix



Nakamura et al. (2022)  
Muslim et al. (2023)

JAMA (2022)

**Boundaries : reasonably foreseeable and preventable scenario definition**

# Purpose

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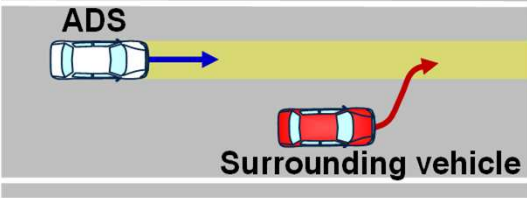
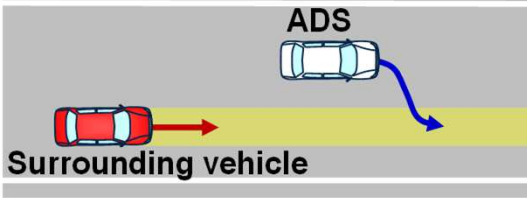
- ◆ **To propose a driver behavior modelling concept to define the preventability**
- ◆ **To apply this concept to specific models based on experimental data and real traffic data, corresponding to the respective roles required by ADS**

## 2. Method

5: METHOD

# Approach to driver behavior modeling

## ◆ Two aspects about preventability definition

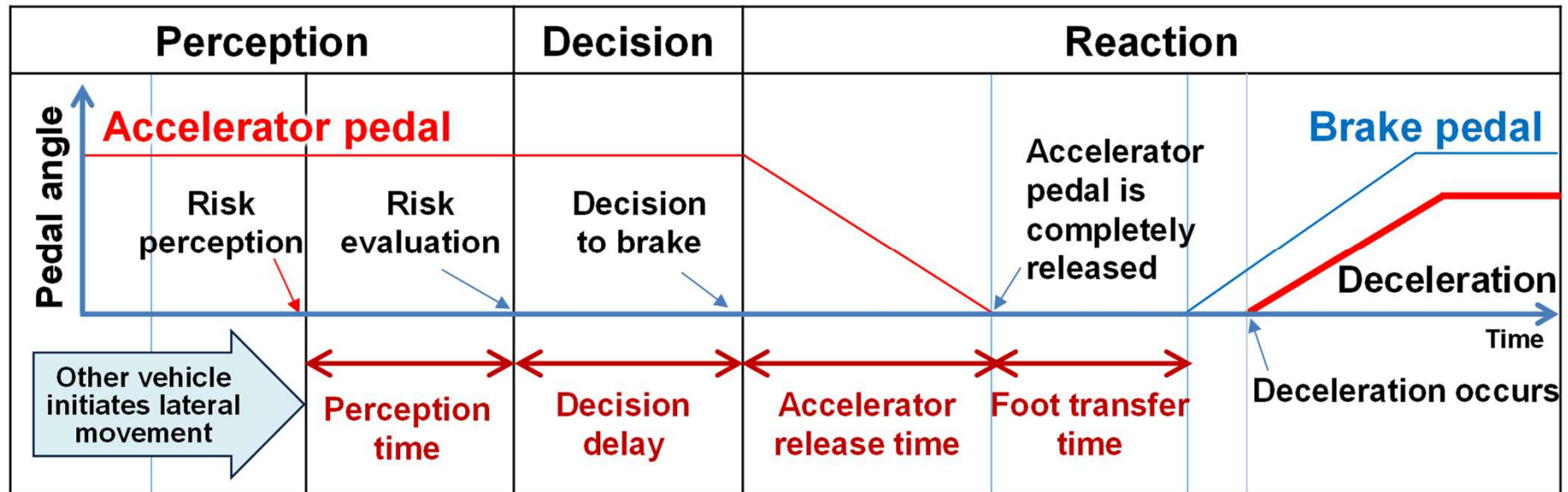
	Responder role ← Role inversion → Initiator role	
<b>Scenario</b>	<b>No.1</b> 	<b>No.7</b> 
<b>Safety requirement</b>	<ul style="list-style-type: none"> <li>- Strive to achieve utmost effort for collision avoidance or damage mitigation while surpassing the performance of human driver</li> </ul>	<ul style="list-style-type: none"> <li>- To temporarily withhold lane change to prevent collisions and avoid obstructing the rear vehicle</li> <li>- To complete the lane change appropriately</li> </ul>
<b>Research subject</b>	Quantification of a <b>competent and careful driver behavior</b>	Quantification about <b>the subjective experience of the rear vehicle driver's feelings</b>

Waymo (2023)

**Different safety requirements : responder role / initiator role**

# Example of responder role

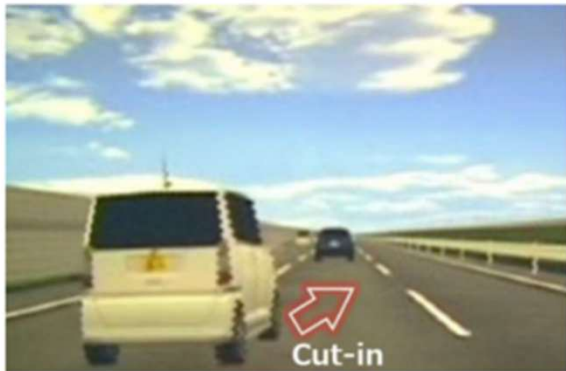
## ◆ Driver's evasive behavior processes by a braking operation



**Requirement : to make its utmost effort to avoid a collision**

# Driving Simulator Experiment 1

- ◆ Data acquisition to define a driver behavior model for responder role
  - 11 ordinary drivers (average age 38.7 (25-49))
  - Data collection driver's utmost effort to avoid a collision
  - Quantification of required time for risk judgement by driver



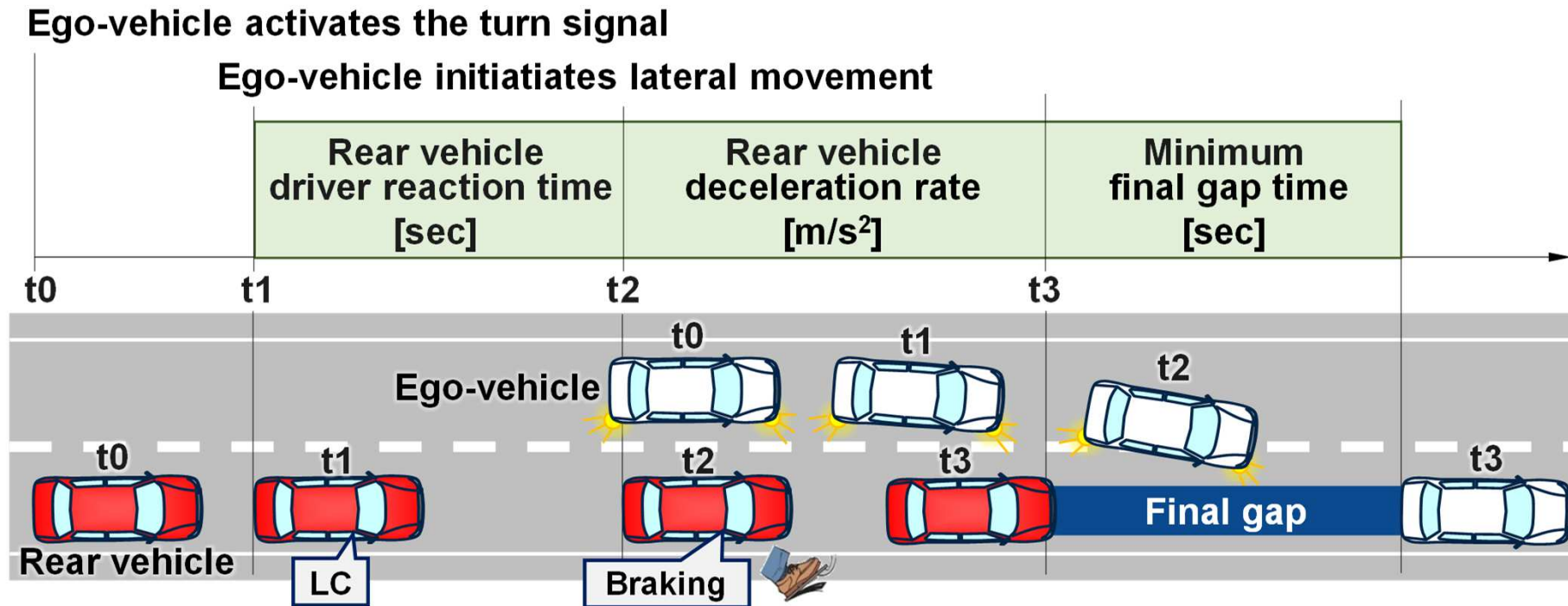
Parameter	Value
Ego-vehicle velocity	100 km/h
Traveling velocity in the adjacent lane	70 km/h
Lateral velocity of cut-in vehicle	1.8 m/s
Time to collision at the onset of the cut-in	3.0 sec

**Quatification : driver's evasive operation by braking as utmost effort**



# Example of initiator role

- ◆ Human driver's behavior processes of a vehicle approaching from behind



**Requirement : to behave to avoid not just collision but obstructing**

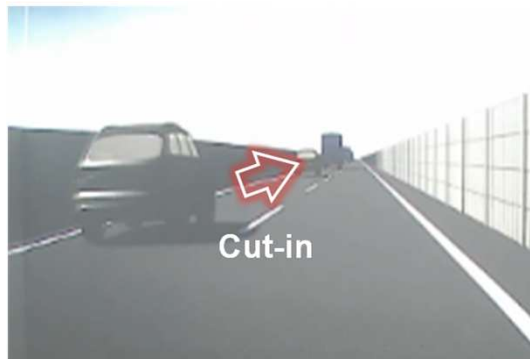
# Driving Simulator Experiment 2

## ◆ Data acquisition to define a driver behavior model for initiator role

**Obstructing progress** ————— [Japanese Road Traffic Act, 1960]

the act of initiating or sustaining movement in a manner that could potentially compel another vehicle to abruptly alter its speed or direction to evade potential danger

- 26 ordinary drivers (average age 42.2 (23-61))



Parameter	Value
Ego-vehicle velocity	120 km/h
Traveling velocity in the adjacent lane	60-110 km/h
Lateral velocity of cut-in vehicle	1.0 m/s
Time to collision at the onset of the cut-in	5.0 sec

**Qualification : inferior driver's reaction to forward cut-in event**

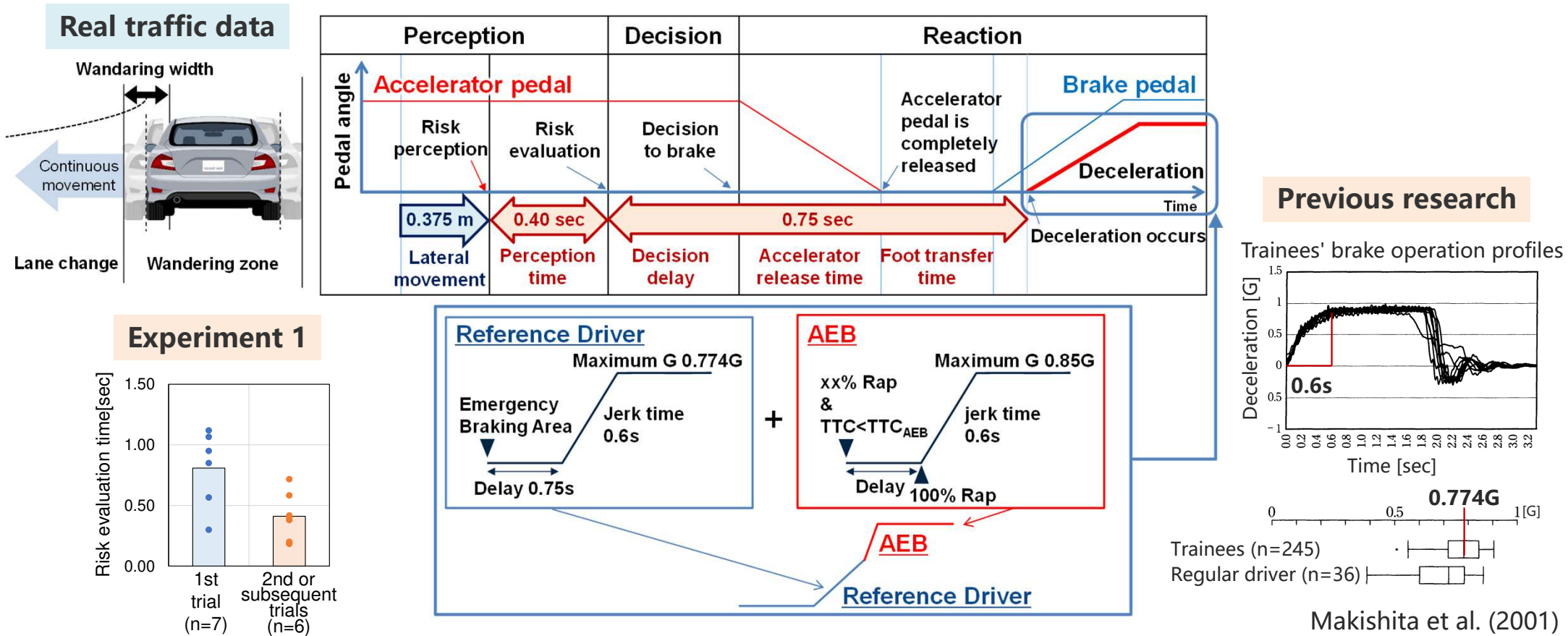
## 3. Results

### 3.1 Driver Behavior Model for "Responder Role"

### 3.2 Driver Behavior Model for "Initiator Role"

# Competent and careful driver model

## ◆ Behavior model surrogating a superior driver performance (braking)



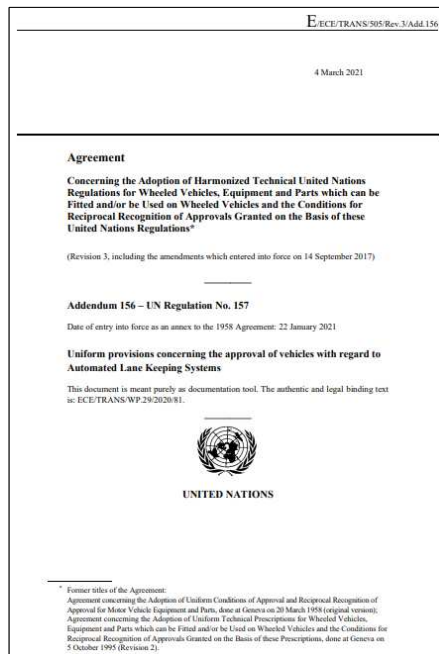
Makishita et al. (2001)

**Specific parameters for competent and careful driver behavior**

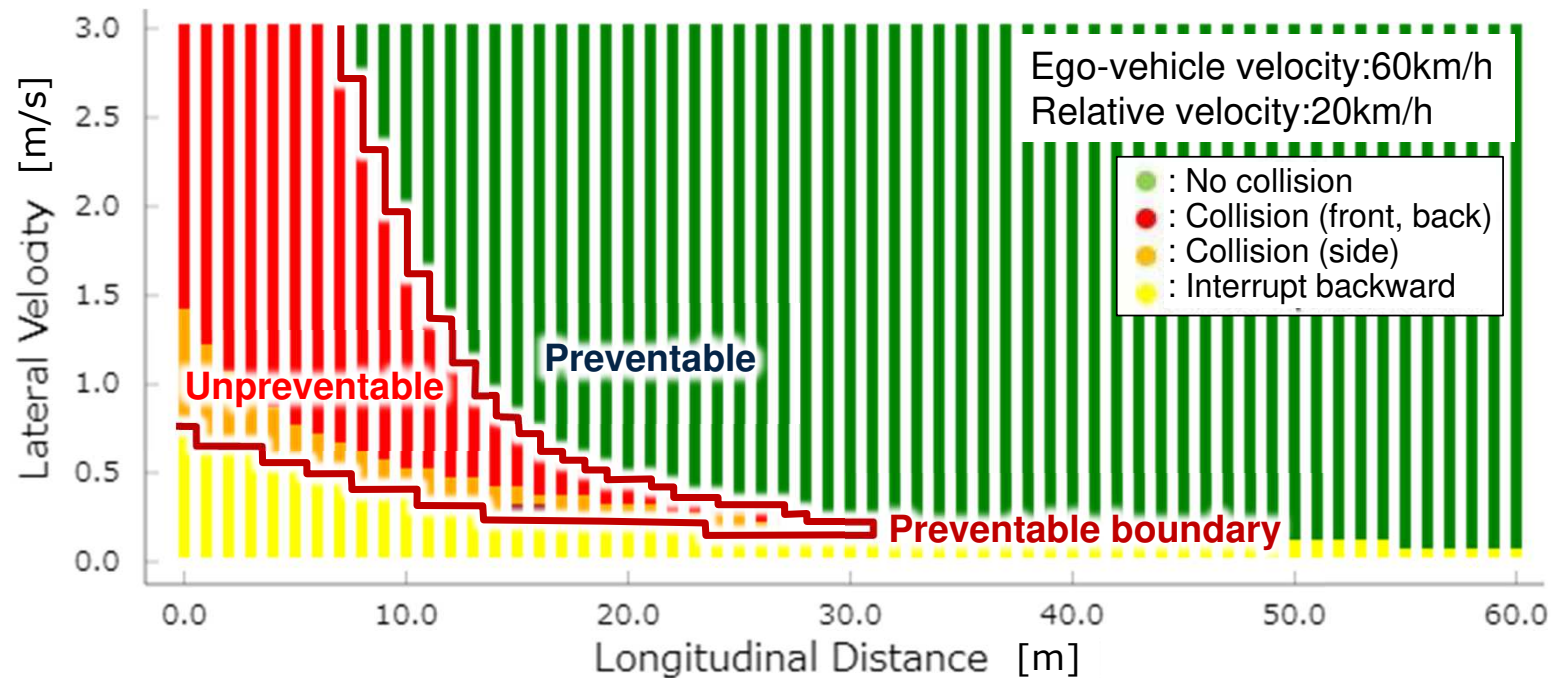
# Provision of safety criteria for responder role

## ◆ Reasonably foreseeable test scenarios with preventable boundary

### UN Regulation No.157



### Traffic disturbance critical scenarios for Automated Lane Keeping System



UN-ECE (2020)

Definite preventable boundary for responder role of ADSs

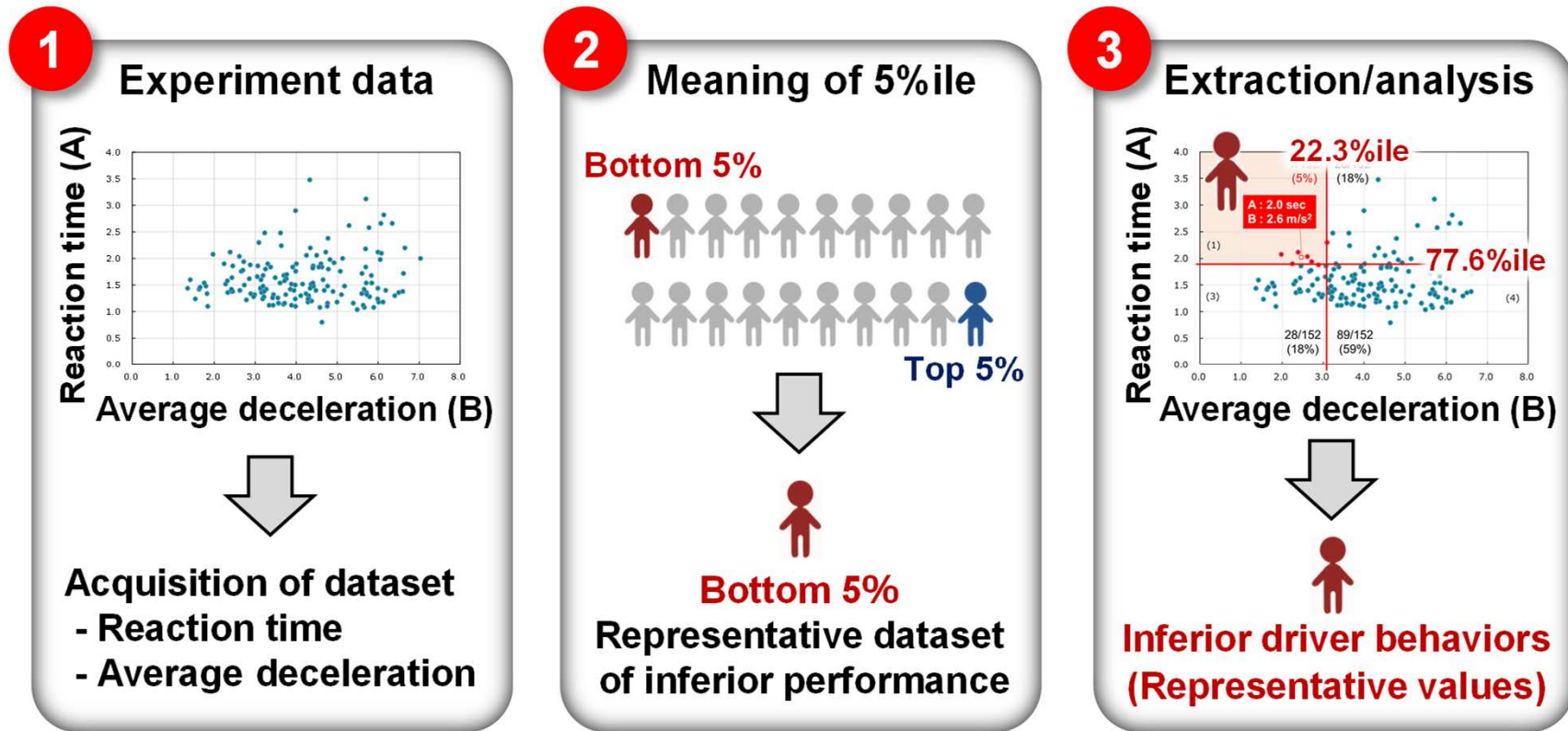
## 3. Results

3.1 Driver Behavior Model for "Responder Role"

**3.2 Driver Behavior Model for "Initiator Role"**

# Concept to analyze experimental dataset

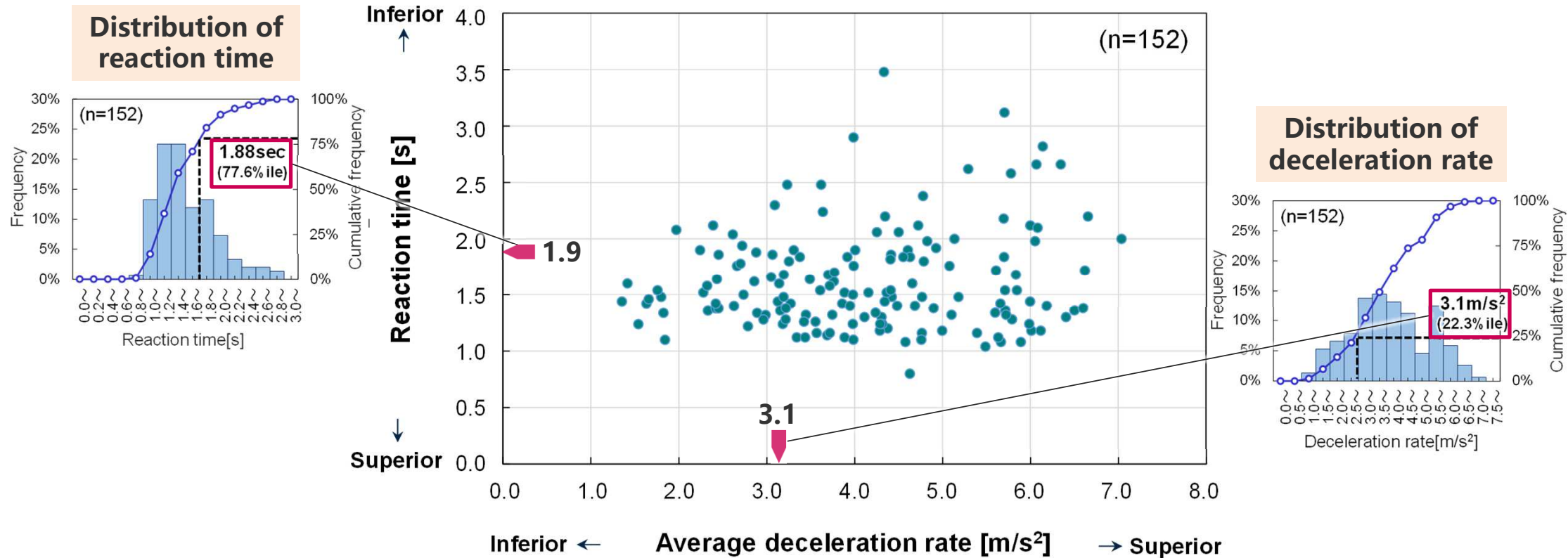
## ◆ Processes to define a inferior human driver behavior



Quantification of obstructing progress coming from initiator's behavior

# Extraction criteria for targeted dataset

## ◆ Relationship between driver reaction time and average deceleration rate

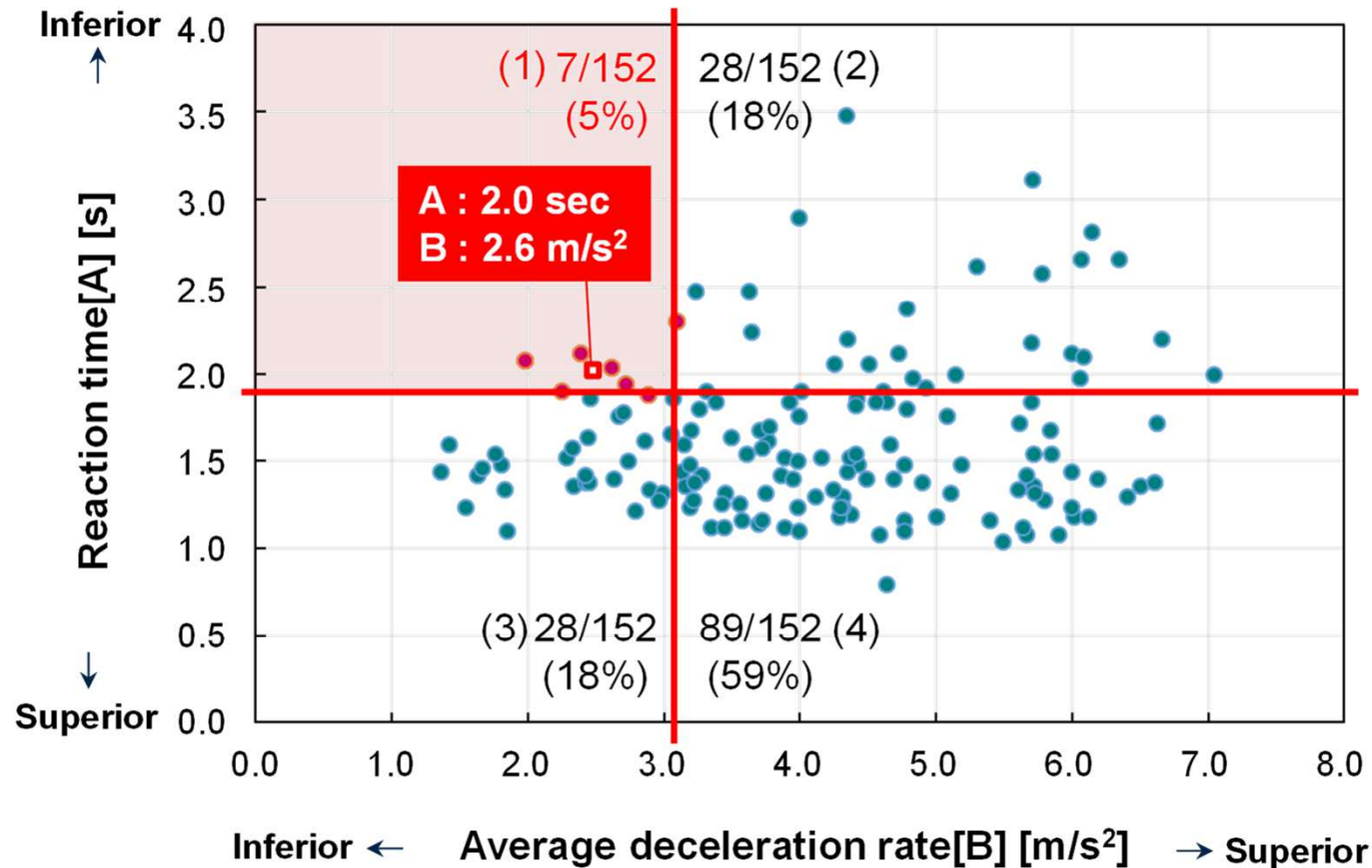


**Extraction criteria reflecting inferior driver performance**



# Inferior driver performance data

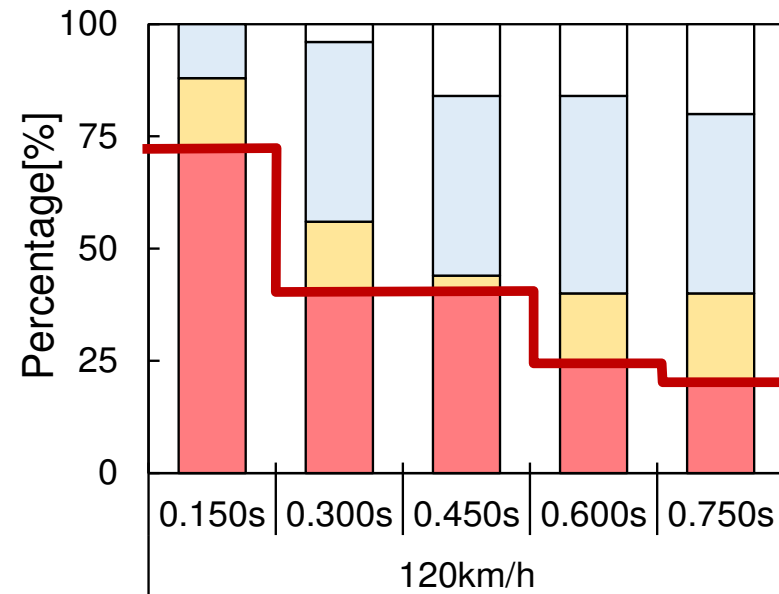
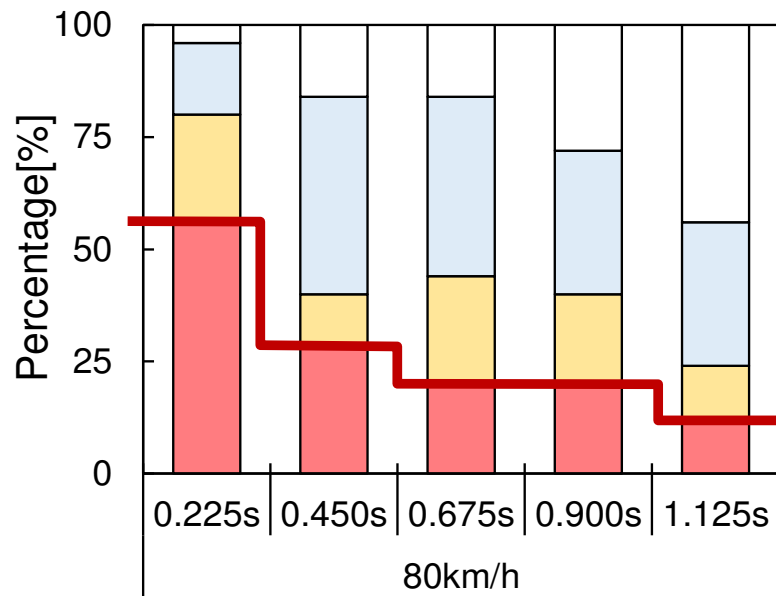
## ◆ Classification result of 4 groups based on driver's performance



Parameterization by extracting bottom 5%ile performance dataset

# Minimum safety margin for rear vehicle driver

## ◆ Component rate of driver reaction toward different time-headway values

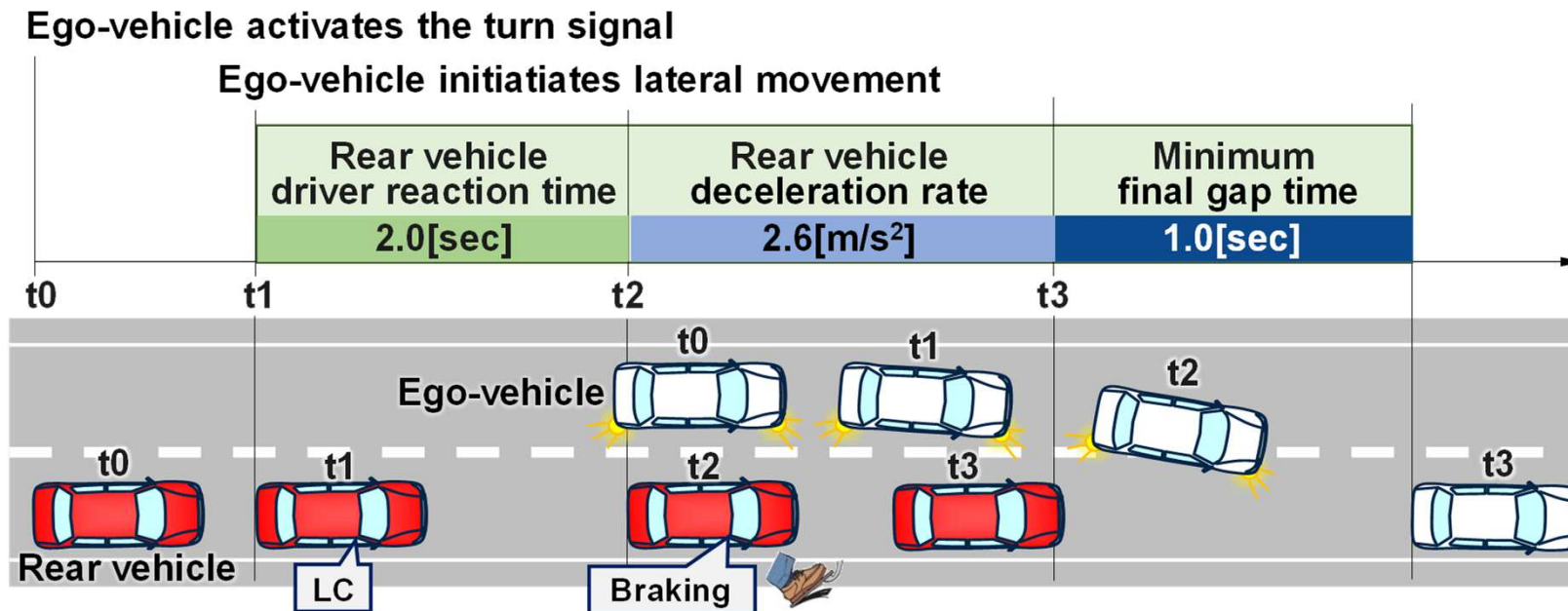


- Braking maneuver (1.5m/s<sup>2</sup> and over)
- Braking maneuver (less than 1.5m/s<sup>2</sup>)
- Release of accelerator
- No reaction

**Rear driver's expectation : more than 1.0 time-headway**

# Provision of safety criteria for initiator role

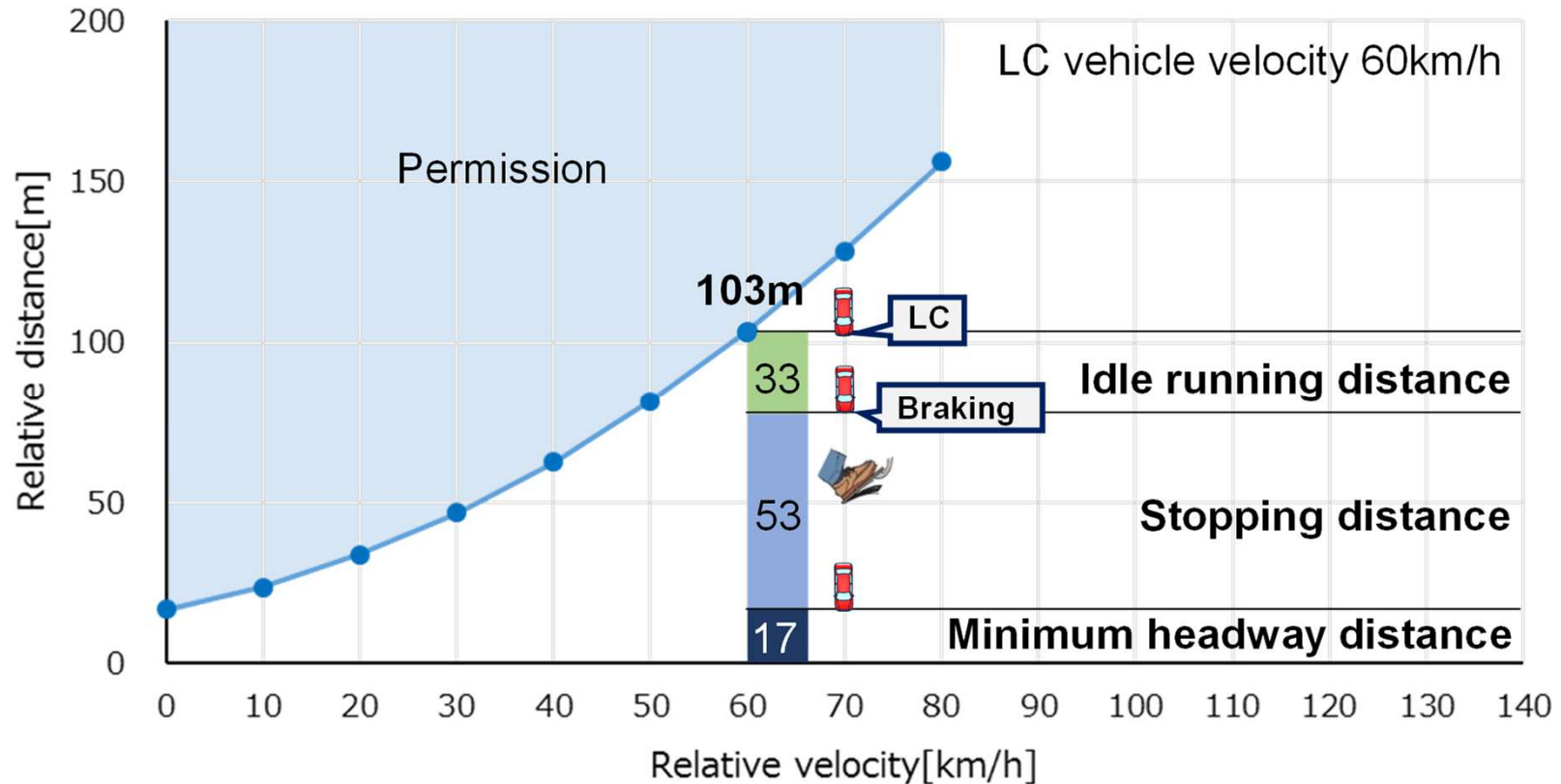
## ◆ Parameters of driver behavior model of rear vehicle



Specific parameters for inferior driver reaction to forward cut-in event

# Required margin for safe lane changing

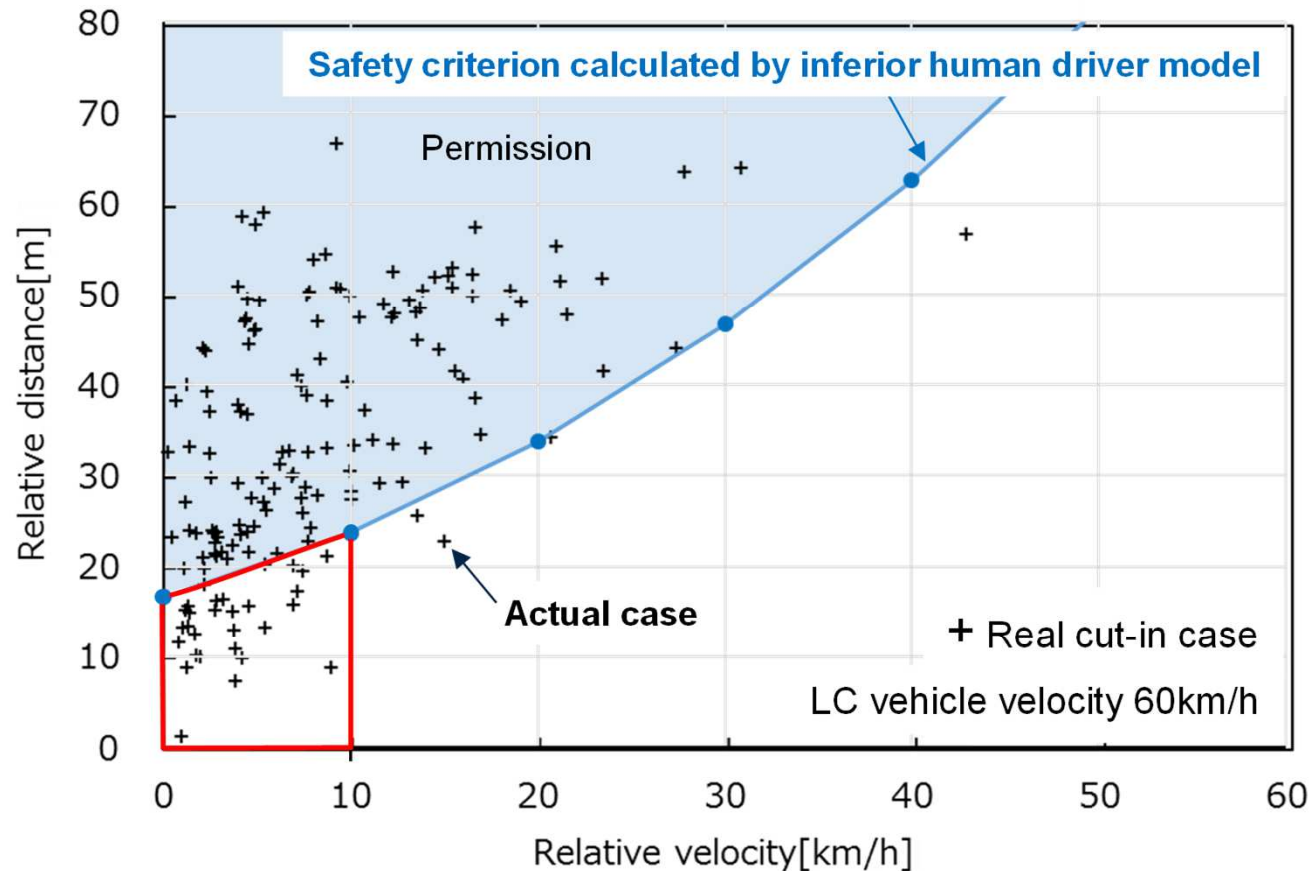
## ◆ Example of calculated distance to assure sufficient margin for rear vehicle



**Safety requirement of initiator's behavior without obstructing progress**

# Suitability of proposed safety criteria

## ◆ Comparison between the proposed safety criterion and actual lane changes



**Tolerant tendency to lane change with relative velocity below 10 [km/h]**

## 4. Conclusion

4. CONCLUSION

# Conclusion

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## ◆ A novel concept of driver behavior modelling

- for defining a preventable boundary through a comparison with human driver behavior
- for derivation of a specific model by parameterizing based on relevant empirical evidences

## ◆ Adaptable approach to define respective preventability to aspects of ADS (responder role/initiator role)

### Future work

- Refinement of driver behavior modeling methodologies
- Applying preventability definition toward vulnerable road users

*Thank you for your kind attention*



**Jtown Specific Environment Area**