

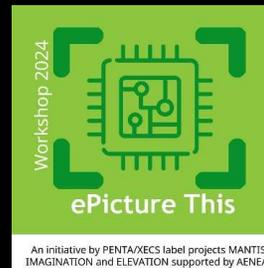
Accidentology & Monitored Deployment



E-Picture This, Eindhoven, 26-8-2024

**Pieter Jonker, Boris Lenseigne,
Serge Lambermont,**

info@resembler.ai | www.resembler.ai



Automated Driving is there.....

Is it safe?





Serge Lambermont - Expert in Safety Electronics and Automated Driving Robotics.

2013 - 2018, Aptiv's Technical Director Automated Driving (Silicon Valley) responsible for Global automated urban driving technologies and activities. Including the urban self-driving vehicle development platforms for the Singapore Automated Mobility on Demand (AMoD) Pilot and urban driving activities in the US and Europe.

2015 Leader of the 3500 miles Coast to Coast Automated drive (San Francisco - New York)
2015-2018 Aptiv's CES urban driving demos.

Pieter Jonker - Expert in Automated Driving and Robotics, RT Image processing and AI. Professor Emeritus of the Delft University of Technology / Cognitive Robotics Department, and Eindhoven University of Technology / Vision based Control.

With his startup Jonker-Makis Robotics he has built multiple robotic solutions for commercial applications in the automotive, medical and indoor robotic fields.

Pieter realized the WE-pods; autonomous 6 persons Pods (WUR Campus) as well as the Mission; a 12 persons Autonomously Driving shuttle bus (Aldenhove testtrack).

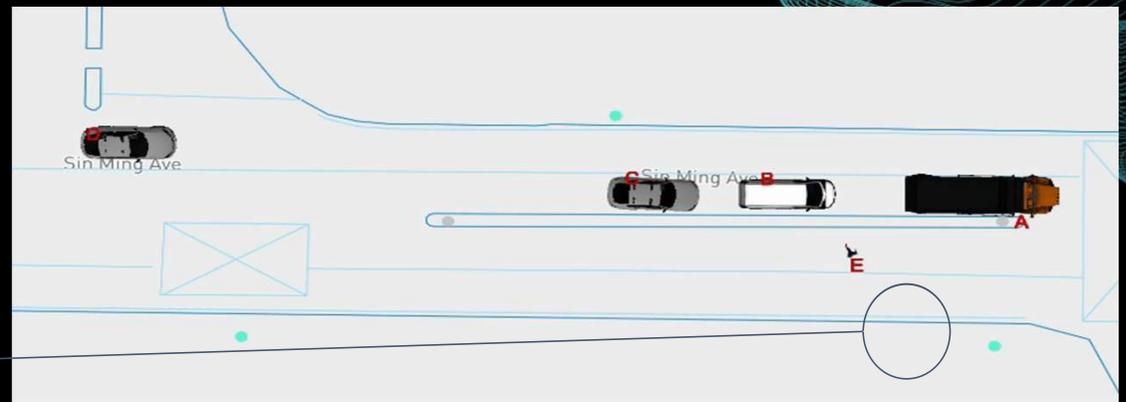
Resemblers Vision on Future Mobility

We aim to create a world where advanced AI systems work seamlessly with road infrastructure and human drivers to improve overall road safety, prevent accidents and learn from near misses

Resemblers uses AI for enhancing safety in future mobility, that is: de-risking ADAS and self driving technology with camera based monitored deployment

How to assess an Automated Vehicle?

Many accidents are prevented by vigilant drivers who anticipate hazards



Can an Automated / Autonomous Vehicle (AV) do that the same or better?
Resemler generates Replacement Tests from real accidents

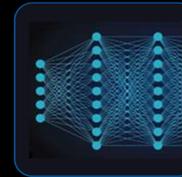
How Resembler works



Ingestion
Incidents from roadside
and dash cam footage



Anonymizer
GDPR compliant

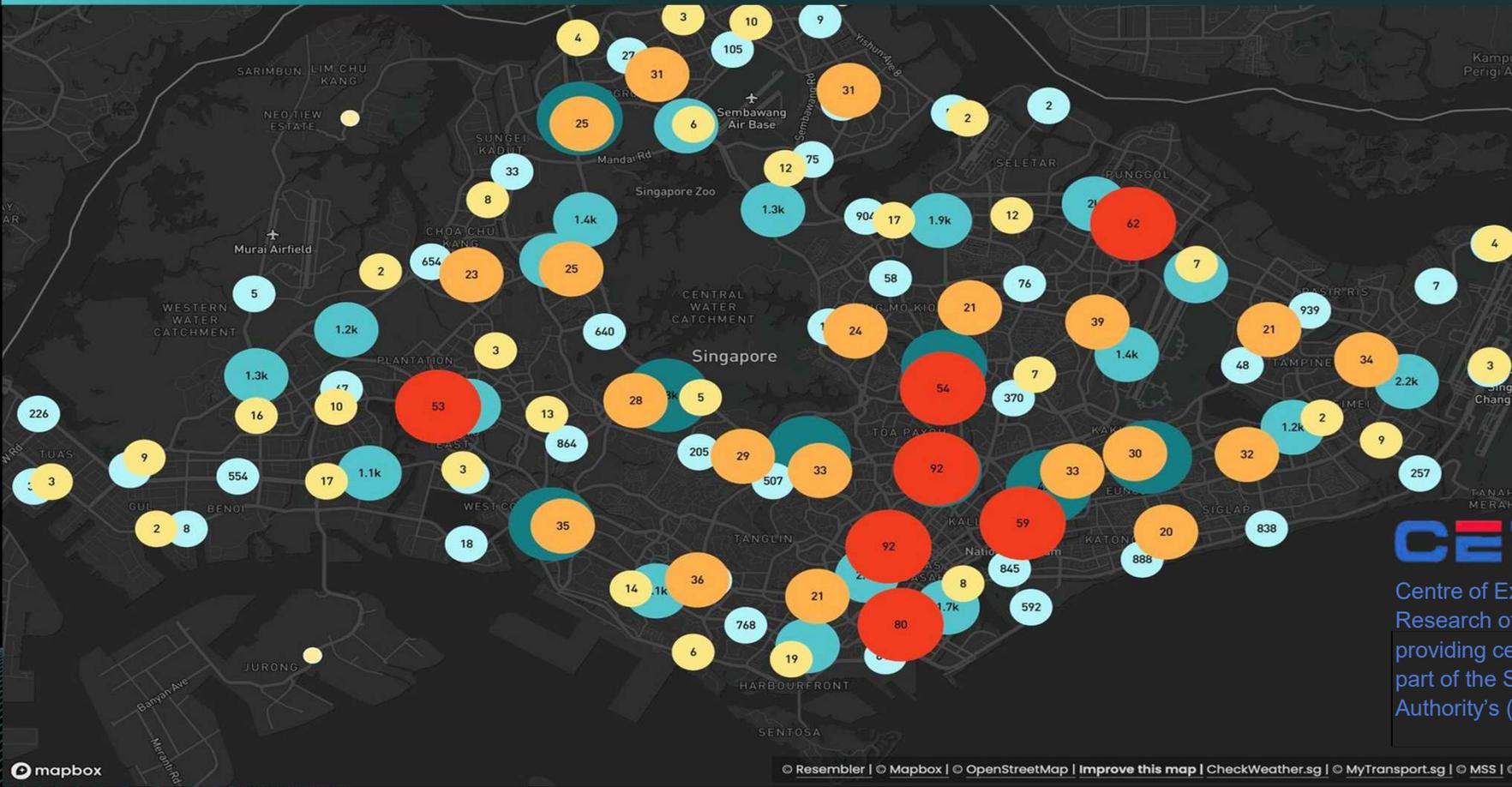


Learning
Deep learning
contextual AI



Resemble
Find similarities in
attributes surrounding
the incidents

Resembler collaborates with CETRAN (Singapore)

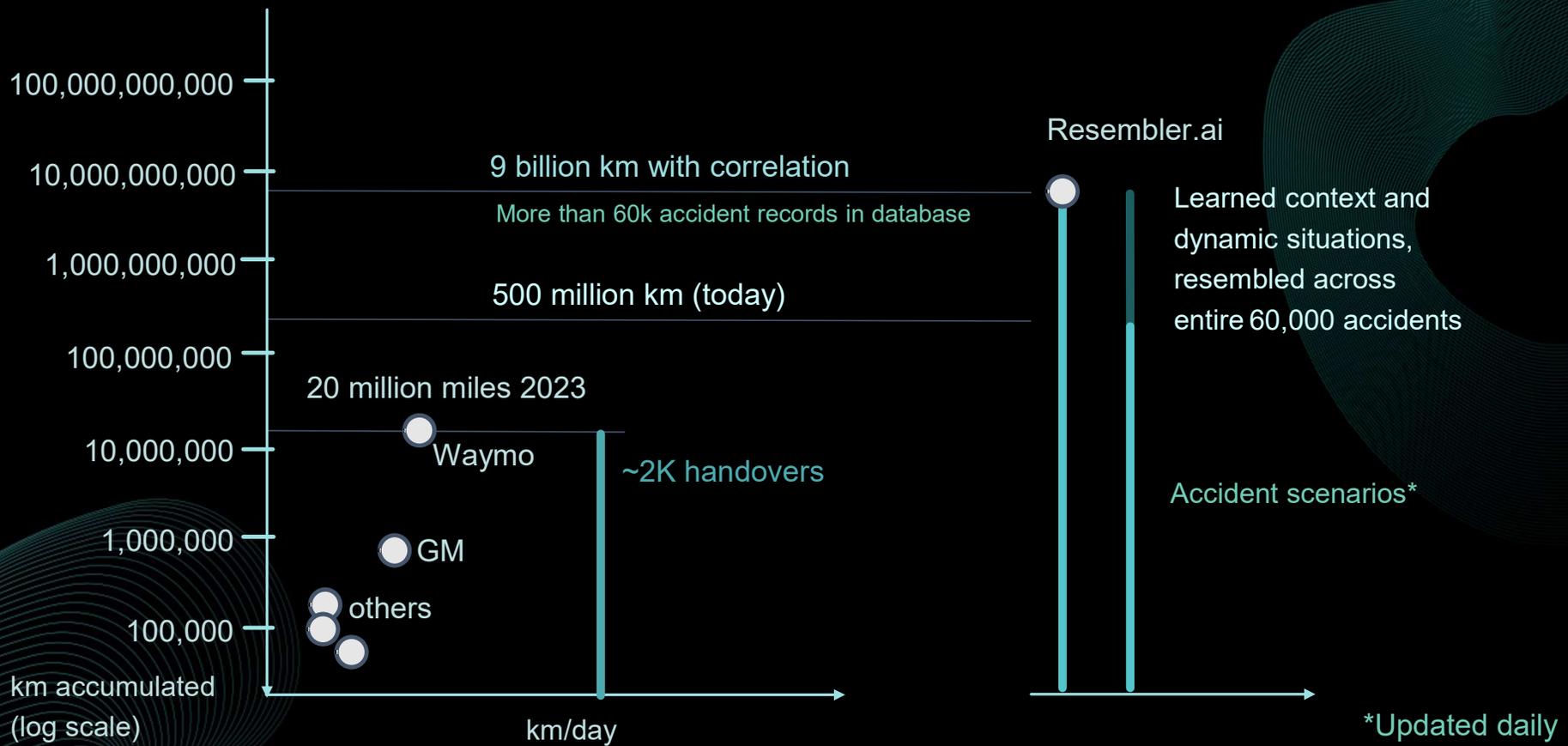


CETRAN

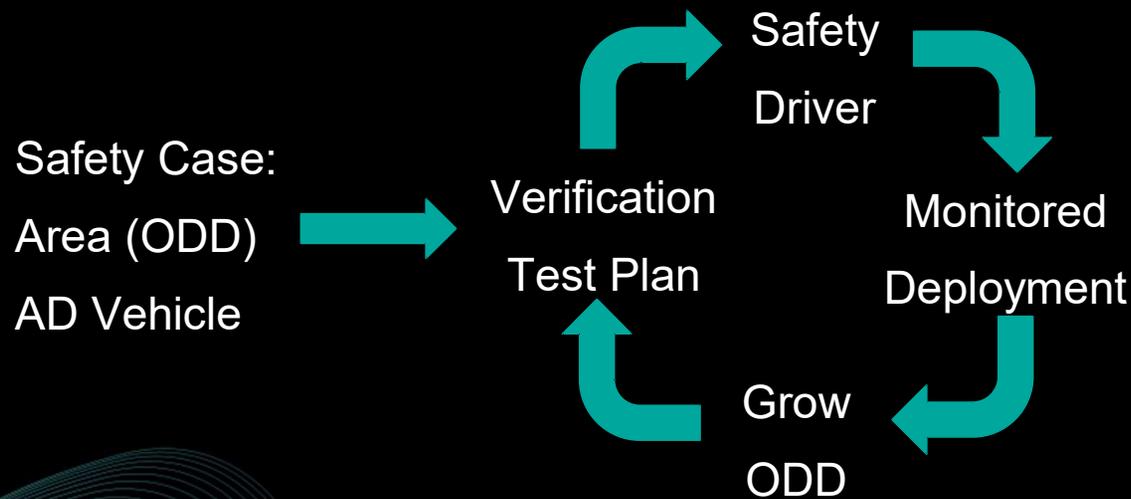
Centre of Excellence for Testing & Research of Autonomous Vehicles providing certification and policy as part of the Singapore Land Transport Authority's (LTA)

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500 Million km Edge Cases (9 billion km correlation)



Resembler's Incremental Deployment of AD



Automated Driving is a complex task with: technical, infrastructure, ethical, regulatory and societal challenges

Challenges of Incremental Deployment

Infrastructure Challenge

Areas of deployment (ODD) each have unique complexities and the AD system must be tested in the area of deployment

Ethical Challenge

Traffic rule compliance is not sufficient - 90% of accidents result from human error

Regulatory Challenge

Data sharing and privacy makes it difficult for companies to get the information they need to verify the area

Resembler: Data ingestion and database building



footage



streetmap



satellite



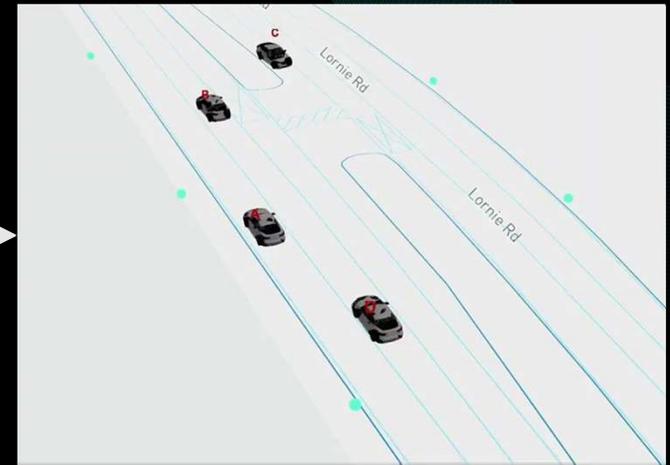
earth



LTA datamall

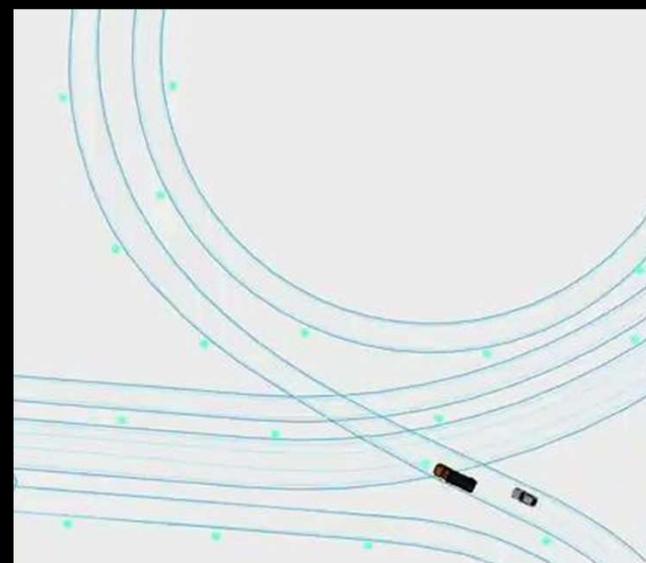


Video footage



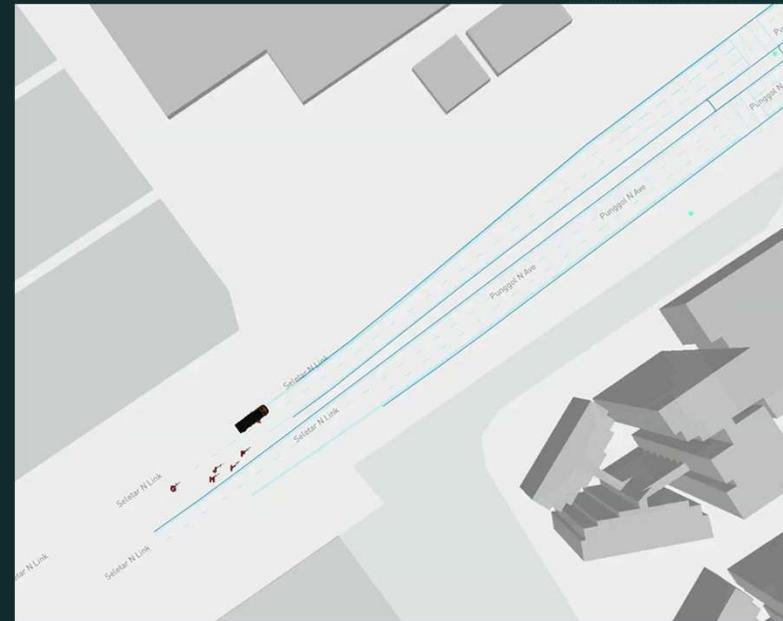
3D Animated Graphics

Resembler: Make abstractions from real accidents



Use Key Performance Indicators (KPIs) to compare A Driving with human driving

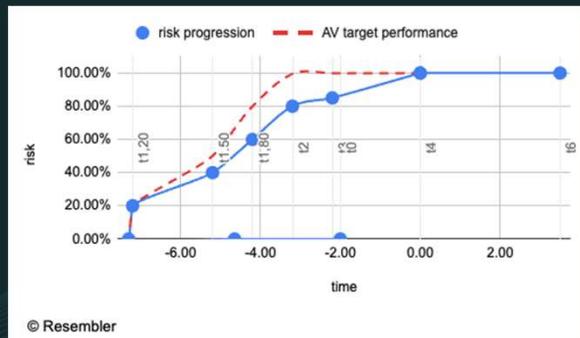
Example 1; Archetypical case with bicycles



{"_id": "6628d14873fa23002135cf04"}

Example 1; Imminent Danger and Risk progression

Imminent Danger KPI



t1,20
multiple cyclists,
cyclist on incorrect lane,
stopped vehicle slow lane

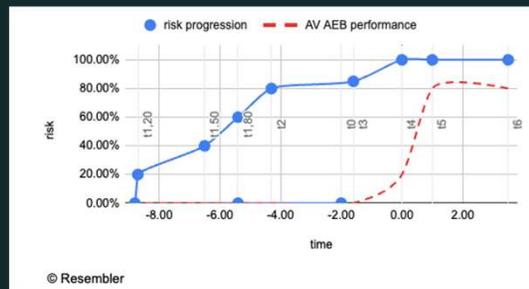


t1,80
cyclist leaning left



Example 2; Imminent Danger and Risk progression

Imminent Danger KPI



t1,20
truck driving too fast around a bend,
cargo starting to tilt

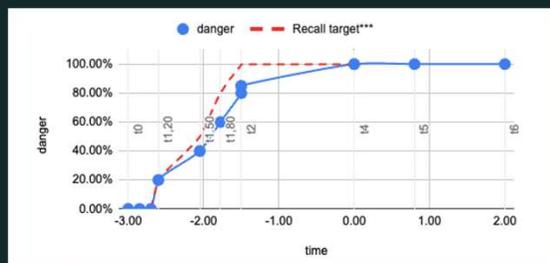


t1,80
Truck falling over



Example 3; Imminent Danger and Risk progression

Imminent Danger KPI



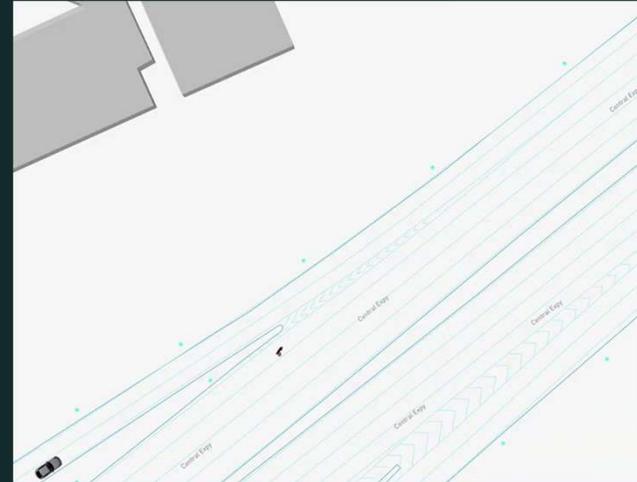
t1,20
Pedestrian going into occlusion



t1,80
Stroller in the road, pedestrian
appearing out of occlusion



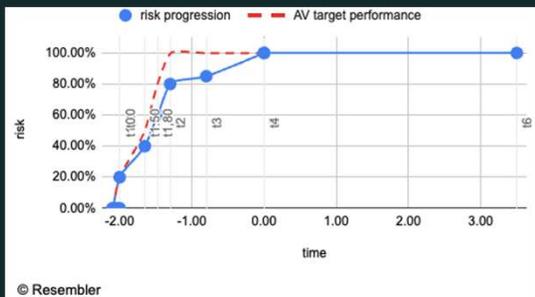
Example 4; An Edge case



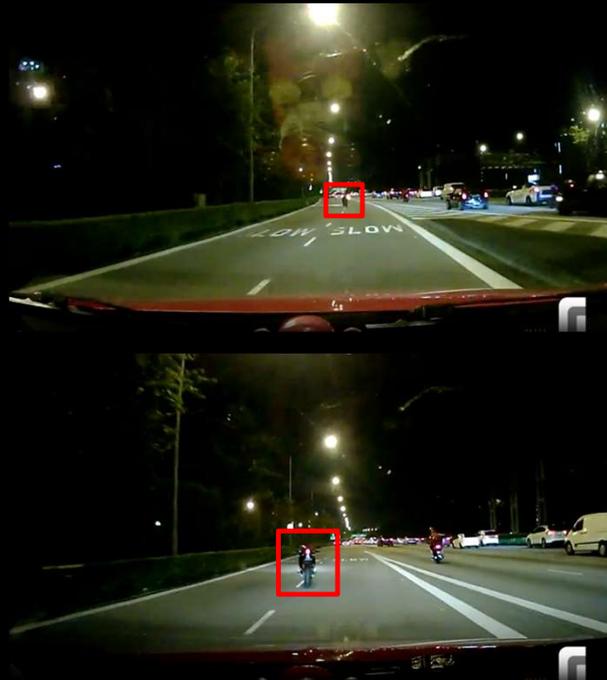
{"_id": "5c0fce879258a4002d048f83"}

Example 4; Imminent Danger and Risk progression

Imminent Danger KPI



© Resemler



t1,20

Slow moving motorcycle, sudden lane change, illegal lane change, moving erratically

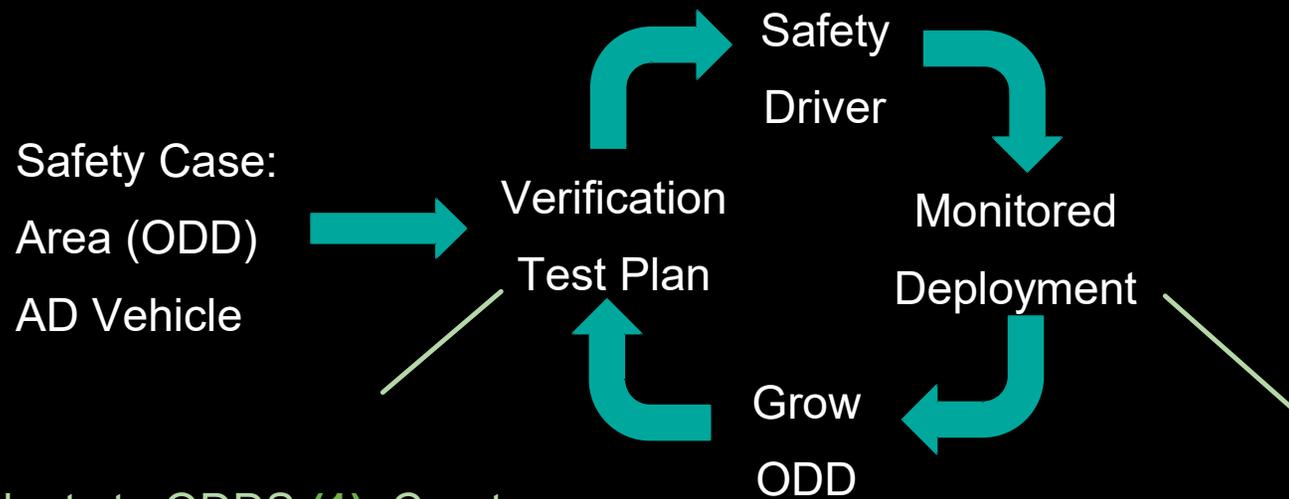


t1,80

No driver on the motorcycle, Motorcycle moves slowly, Motorcycle moves erratically



Resembler Products (5x)

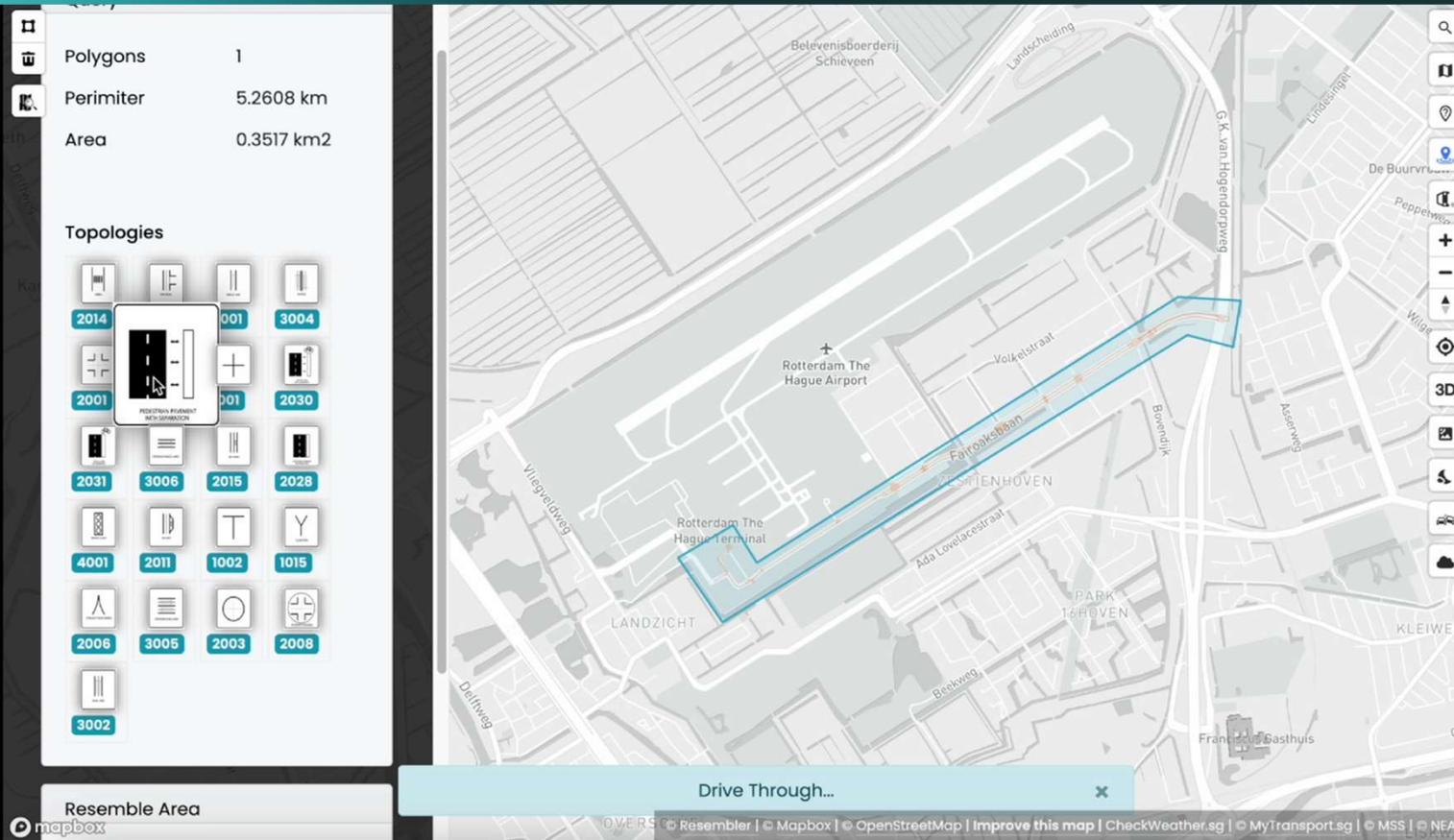


Map accidents to ODDS (1), Create verification test plan(s) and KPIs from an equivalent of 500M km data coverage (2), Generate opendrive/simulator inputs for the replacement tests(3)

Compare ODDs (4)

Digital Twin: Monitor and compare dash-cam triggers with pre-existing human incidents, accidents and handovers (5)

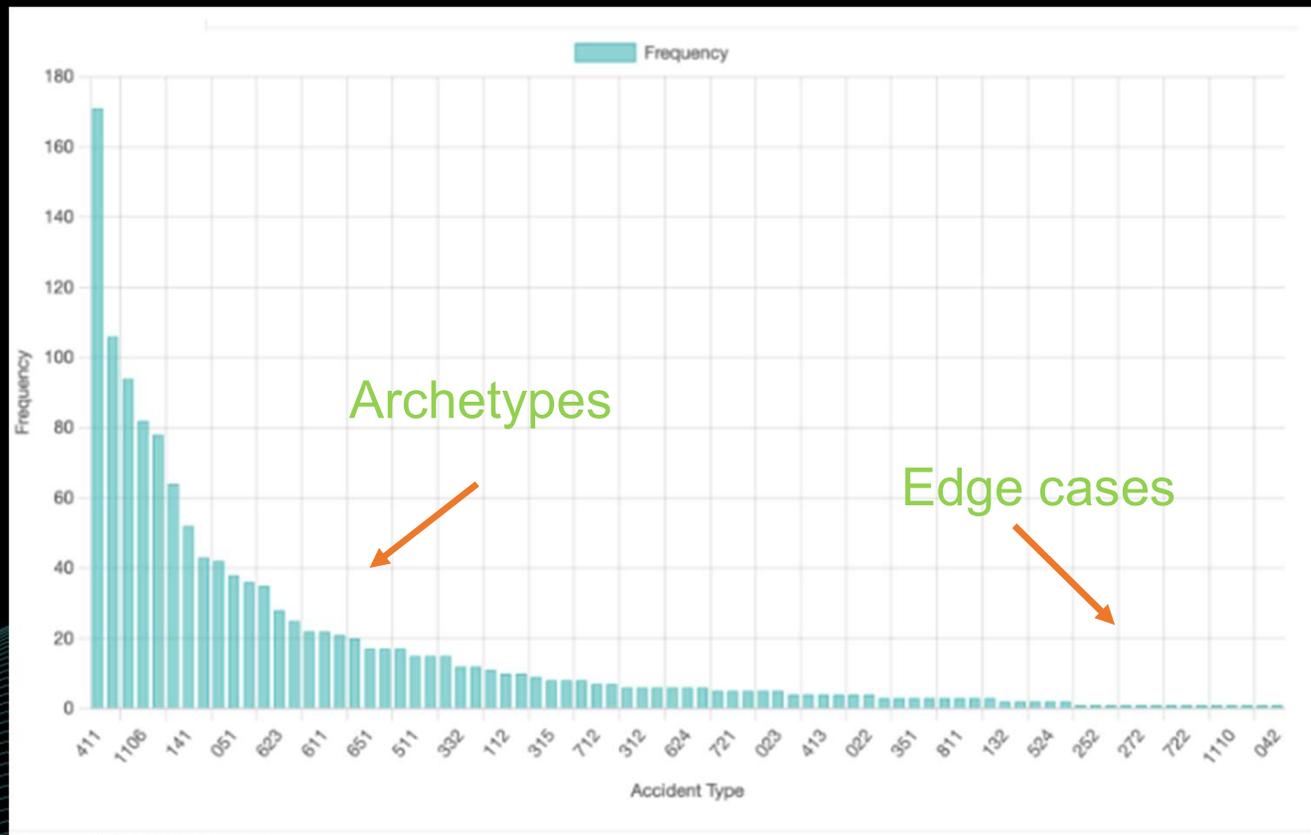
1a - Resemble (re)map accidents / incidents to ODDs



Remapping
Singapore
accidents to
possible
accidents at
the ODD
Rotterdam-The
Hague airport
<>
Metro_Station-
Meijersplein

(Normalize)
(with AV x)

1b – Select test cases based on occurrence and severity



2 – Generate an ODD Verification & AD Test Report

Event

Accident ID: 642abaaa7c821200215643b4 **Incident date:** 2023-04-03T11:38:18.297Z

Accident type: 653

3D model: [652abaaa7c821200215643b4.mov](#)

Query: {"*_id": "642abaaa7c821200215643b4"} **Location:** Sin Ming Avenue

event details

Occurrence

Occurrence

26.681250 km between events of accident type 653

1.12% of accidents in database are of accident type 653

Severity

Severity

3

S0 no injury, S1 = Injury, S2 = Severe Injury, S3 = fatal

Crash Energy

Crash

Energy (J) 4,782

Impact Force (kN) 4,545

Severity vs Occurrence

Occurrence (y-axis) versus Severity (x-axis)

Occurrence 1.12%

Severity 3

y-axis Percent contribution to total population of accidents (low % = edge case)

x-axis S0 = no injury
S1 = injury
S2 = severe injury
S3 = fatal

recorded incident provides minimum occurrence with severity

Qualitative Assessment

Qualitative Assessment

On a sunny and clear day in an urban area, an incident nearly resulted in an accident. The incident occurred on a two-lane road with a median dividing structure to separate opposing lanes, ensuring collision prevention. The road is dry, providing good braking distance. The pedestrian footpath is separated from the road.

In this scenario, a pedestrian, classified as a vulnerable road user (VRU), was pushing a stroller. The victim involved in the near-accident was a passenger vehicle. The situation is highly unusual and unpredictable, representing an edge case due to its rarity. The key contributing factor to the incident was occlusion. The pedestrian walked into the road from behind a vehicle, obstructing the view of the approaching passenger vehicle. This obstructed view left the driver with limited time to react, almost leading to a collision.

Given the complexity of this traffic situation, it underscores the importance of increased vigilance and safety measures for both drivers and pedestrians. Awareness and caution are crucial to avoid such rare and potentially hazardous incidents on the road.

qualitative assessment of incident | accidentology

KPI

Imminent Danger Level

Danger Contribution (micro-ODD, behavior)

label	video	time	danger	Percentile*	Recall target**	Semantic	Danger Contribution	
15	11.9	2.90	100.00%				11.20	11.80
15	8.4	2.80	100.00%				Perception	55%
14	7.6	0.00	100.00%	accident		99.90%	Classification	30%
13	6.1	-1.50	85.00%	must steer		99.90%	Intention predic	45%
12	6.1	-1.50	80.00%	must brake		98%	Planning	70%
11.80	5.825	-1.78	80.00%		80%	80%	Control	50%
11.50	5.55	-2.05	40.00%		50%	50%		
11.20	5	-2.80	20.00%	first danger	20%	20%		
11.20	4.9	-2.70	0.00%		0%	0%		
2.45	2.45	-2.85	0.00%					
0	0	-3.00	0.00%					

* human performance

** recall based on accidentology one edge case (distribution human performance not known)

*** accumulation indicates the semantics that contribute to the perceived human danger level based on accidentology experience

AD Verification

AD Assessment

Comprehensive Verification Plan for the Automated Vehicle Accident:**

“(A) Objective of the Test**

The objective of the verification plan is to evaluate the performance and safety of the automated vehicle’s perception and planning systems in a complex and unusual traffic scenario. The test aims to assess the vehicle’s ability to detect and respond to potential risks posed by vulnerable road users (VRUs) and dynamic obstacles in urban environments. The focus is on understanding how the vehicle’s perception and planning systems handle occlusion situations to prevent accidents.

“(B) Verification for the Perception System:**

1. **“Occlusion Detection Test**** Evaluate the perception system’s capability to detect occluded objects, such as the pedestrian behind the vehicle, using different occlusion levels in controlled scenarios.
2. **“VRU Recognition Test**** Assess the system’s accuracy in recognizing VRUs, especially when they are pushing strollers or other objects, in various environmental conditions.
3. **“Obstacle Tracking Test**** Verify the system’s ability to track and predict the movement of occluded objects to determine potential collision risks.
4. **“Edge Case Testing**** Test the perception system’s performance in challenging and rare situations like occlusion behind other vehicles, considering various lighting and weather conditions.
5. **“Scenario Reproduction**** Validate the system’s response to similar occlusion incidents using real-world data and simulations, comparing the outcomes with the actual incident.

“(C) Verification for the Planning System:**

1. **“Emergency Braking Test**** Evaluate the planning system’s decision-making capabilities to trigger emergency braking when a potential collision with a VRU is detected.
2. **“Obstacle Avoidance Test**** Assess the vehicle’s maneuvering abilities to avoid colliding with occluded objects or dynamically appearing obstacles in the road.
3. **“Hazard Perception Test**** Test the planning system’s response to sudden and unexpected actions of VRUs, such as a pedestrian suddenly entering the road from behind a vehicle.
4. **“Interaction with Median Structure**** Verify that the vehicle can navigate safely around the median structure without compromising the safety of occupants and other road users.
5. **“Decision Consistency Test**** Evaluate the planning system’s decision consistency in handling similar occlusion incidents, ensuring a safe and reliable response.

****Additional Test for Initial Risk at 11.20****

Conduct a detailed review and analysis of the vehicle’s sensor data, including perception and planning logs, to understand the system’s behavior at 11.20. Simulate the same conditions and scenario to validate the vehicle’s response and identify any potential improvements.

(Using LLMs)

Specification of:

- Perception Tests
- Action Test
- Behaviour Tests

i.e. Replacement Tests

Example: [Verification Test Plan](#)

3 – Generate (Opendrive) Simulator input



[carla_input_resembler.mp4](#)

human performance

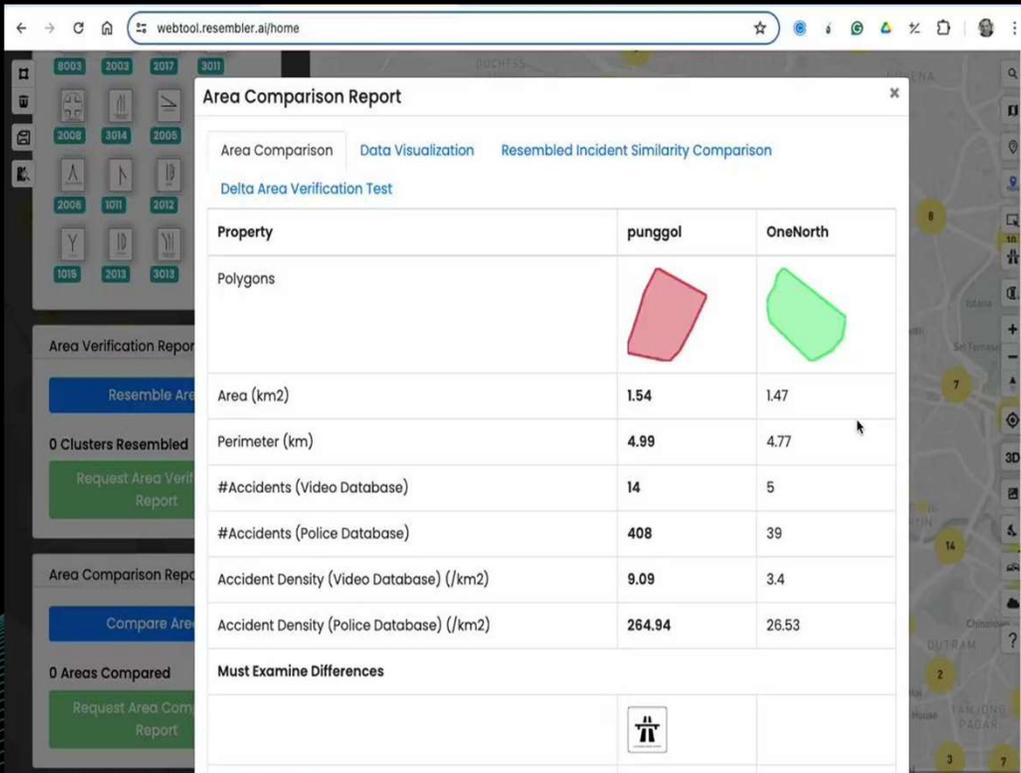


[carla_output.mp4](#)

AD system under test *

* development in collaboration with CETRAN

4 - Compare ODDs to reduce testing or enlarge the ODD



The screenshot displays a web browser window at webtool.resembler.ai/home. A modal window titled 'Area Comparison Report' is open, showing a comparison between two areas: 'punggol' (highlighted in red) and 'OneNorth' (highlighted in green). The report includes a table with various metrics and a 'Must Examine Differences' section.

Property	punggol	OneNorth
Polygons		
Area (km2)	1.54	1.47
Perimeter (km)	4.99	4.77
#Accidents (Video Database)	14	5
#Accidents (Police Database)	408	39
Accident Density (Video Database) (/km2)	9.09	3.4
Accident Density (Police Database) (/km2)	264.94	26.53
Must Examine Differences		

Compares areas of deployment

Creates incremental verification test plans

Works globally, e.g. compares deployment in Singapore with deployment in US or EU

5 – Realise Monitored Deployment



Trigger
Footage + GPS



animation+model,
contextual data



Resemler toolset:
database, area pareto,
ODD compliance, similar
accidents, test plans



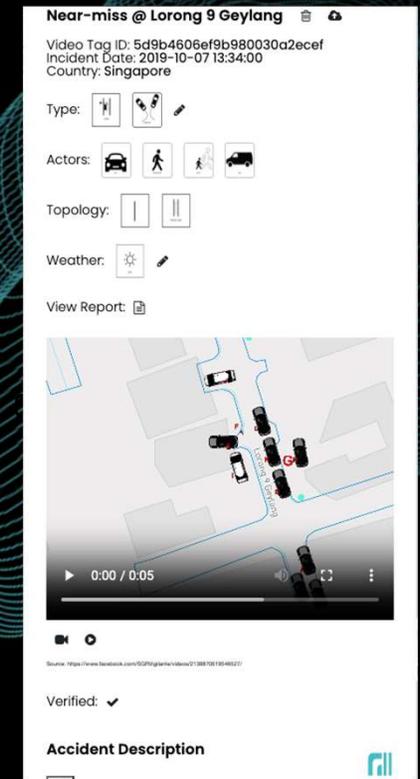
Incident view

anonymized

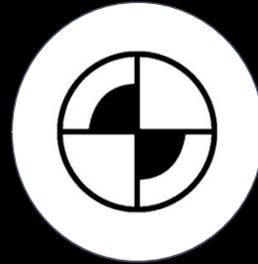


Control Center View

GDPR compliant



Auto-Report



Thank You