



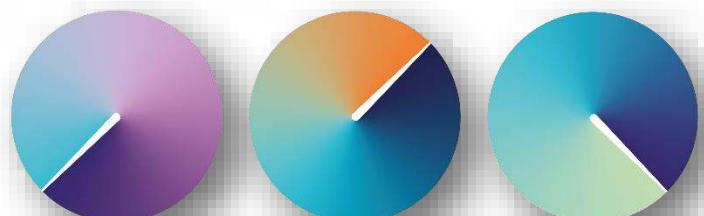
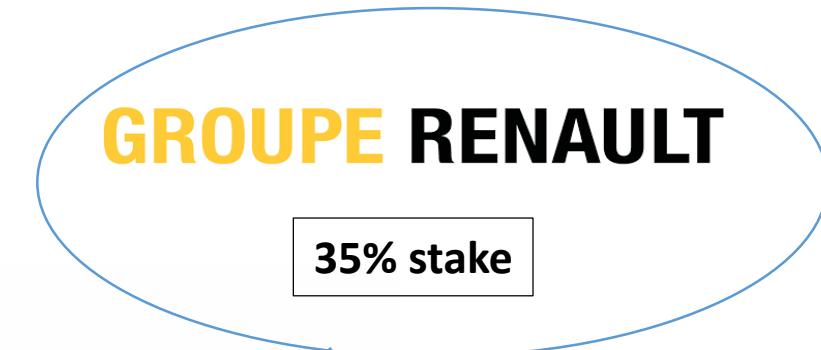
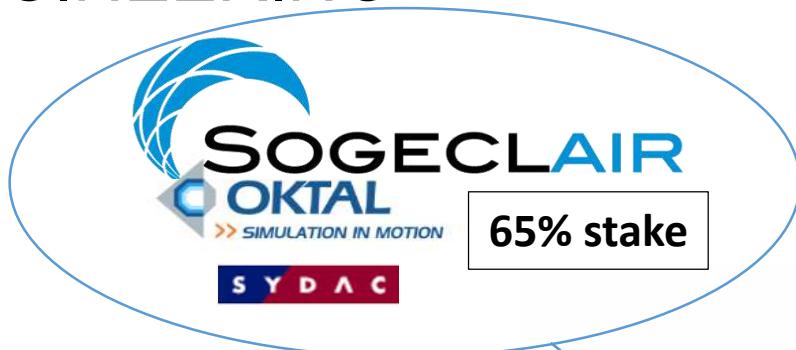
**AVSIMULATION**

AV systems validation using SCAneR studio software

Alex Grandjean – AV Validation project leader

# AVSIMULATION PRESENTATION

# 30 YEARS EXPERIENCE IN SIMULATION, AUTOMOTIVE AND ENGINEERING



## AVSIMULATION



Creation date : 2017  
2018 Turnover: 12,5 M €  
Employees: 90

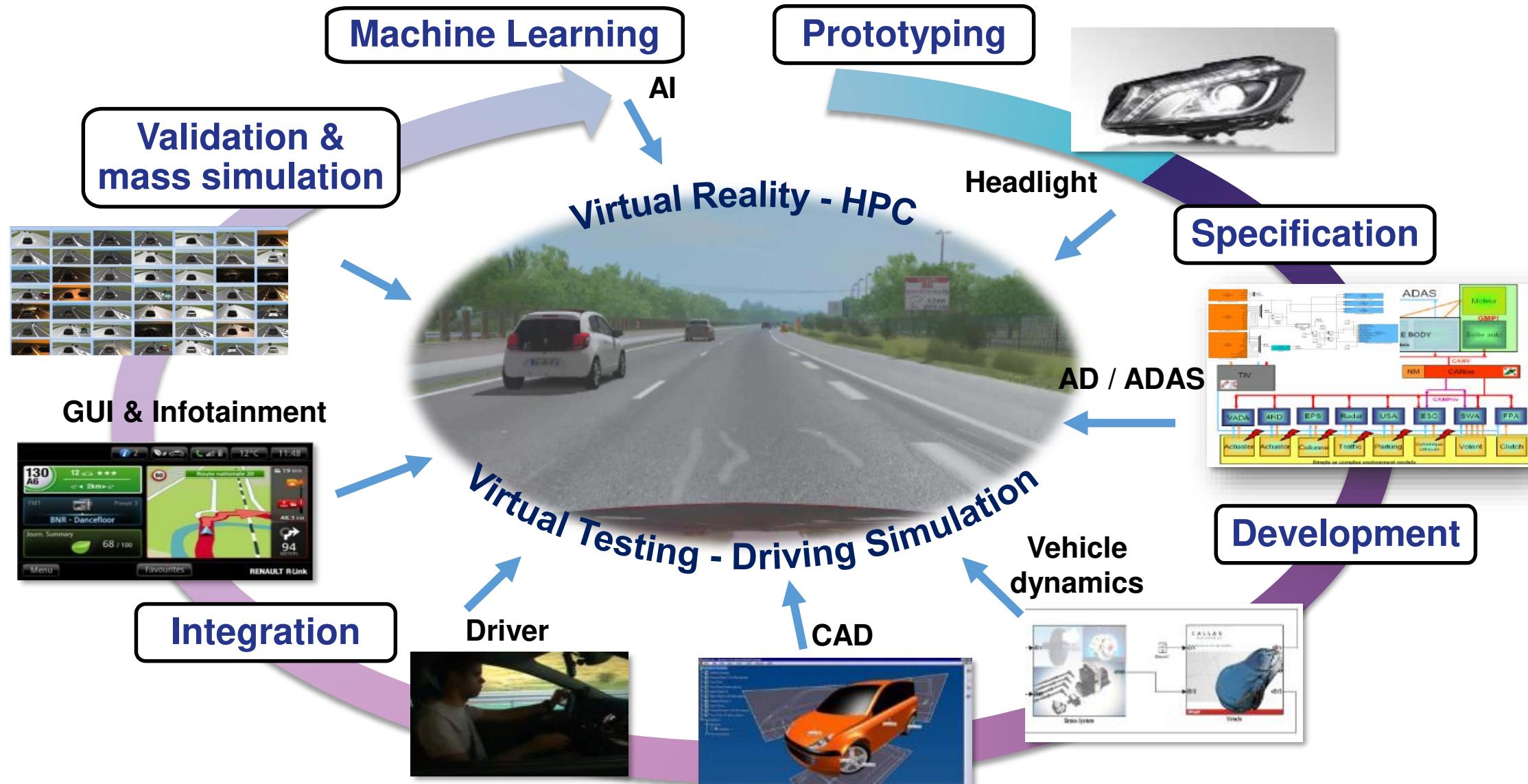
## SCANeR™

### Area of expertise:

- Automotive
- Driving simulation
- Autonomous Driving
- Software development



# SCANeR™ ACROSS THE INNOVATION LIFECYCLE



# WHY SIMULATION FOR AV VALIDATION ?

## Billions of Miles Of Testing?

- Need to test for at least ~3x crash rate to validate safety**
  - Hypothetical deployment: NYC Medallion Taxi Fleet
  - 13,437 vehicles @ 70,000 miles/yr = 941M miles/year
  - 7 critical crashes in 2015  
134M miles/critical crash (death or serious injury)
- How much testing to validate critical crash rate?**
  - Answer: 3x – ~10x the mean crash rate
    - 3x is without any crash
    - If you get a crash, you need to test longer
  - Design changes reset the testing clock
- Assumes random independent arrivals**
  - Exponential inter-arrival spacing
  - Is this a good assumption?*

Edge Case Research  
<https://goo.gl/xtm5Q2>

Testing Miles	Confidence if NO critical crash seen
122.8M	60%
308.5M	90%
<b>401.4M</b>	<b>95%</b>
617.1M	99%

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## Is Trillions of Miles of Testing Enough?

- At best, each road hazard type arrives independently**
  - But, that doesn't tell us how often each event arrives
  - No surprise if distribution of scenarios is heavy-tailed
    - E.g., exponential arrivals, but power law distribution of scenarios
- Beyond that, conditions are not random/independent**
  - Correlations: geographic region, weather, holiday, commute
  - Betting against a heavy tail edge case distribution is risky
- Need to think more deeply than "drive a lot of miles"**
  - Need to have some assurance your system will work beyond accumulating miles
  - That's what software safety approaches are for!
    - OK, so what happens if you try to apply ISO 26262? ...

Edge Case Research  
<https://goo.gl/xtm5Q2>

Haleakalā National Park  
<https://www.nps.gov/hale/index.htm>

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# WHY SIMULATION FOR AV VALIDATION ?

## Validating High-ASIL Systems via Testing Is Challenging

### Need to test for at least ~3x crash rate to validate safety

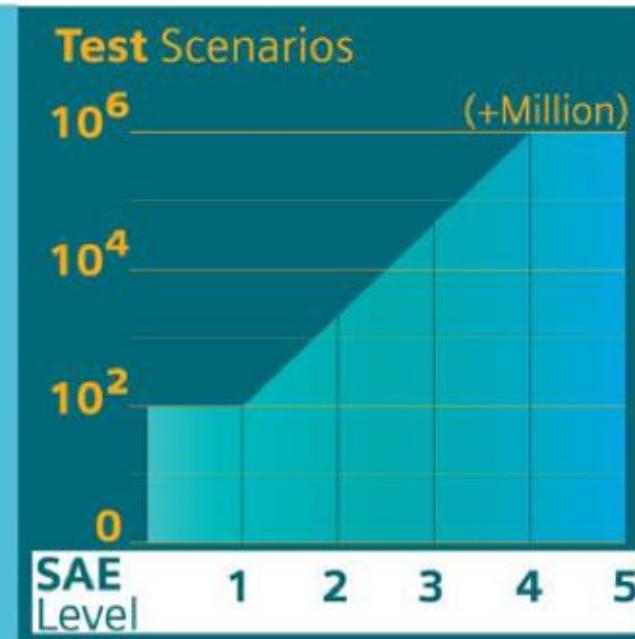
- Hypothetical fleet deployment: New York Medallion Taxi Fleet
  - 13,437 vehicles, average 70,000 miles/yr = 941M miles/year  
[2014 NYC Taxi Fact Book]  
[Fatal and Critical Injury data / Local Law 31 of 2014]
  - 7 critical crashes in 2015  
→ 134M miles/critical crash (death or serious injury)
- Assume testing representative; faults are random independent
  - $R(t) = e^{-\lambda t}$  is the probability of not seeing a crash during testing
- Illustrative: How much testing to ensure critical crash rate is at least as good as human drivers? → (At least 3x crash rate)
  - These are optimistic test lengths...
    - Assumes random independent arrivals
    - Is simulated driving accurate enough?

Testing Miles	Confidence if NO critical crash seen
122.8M	60%
308.5M	90%
<b>401.4M</b>	<b>95%</b>
617.1M	99%

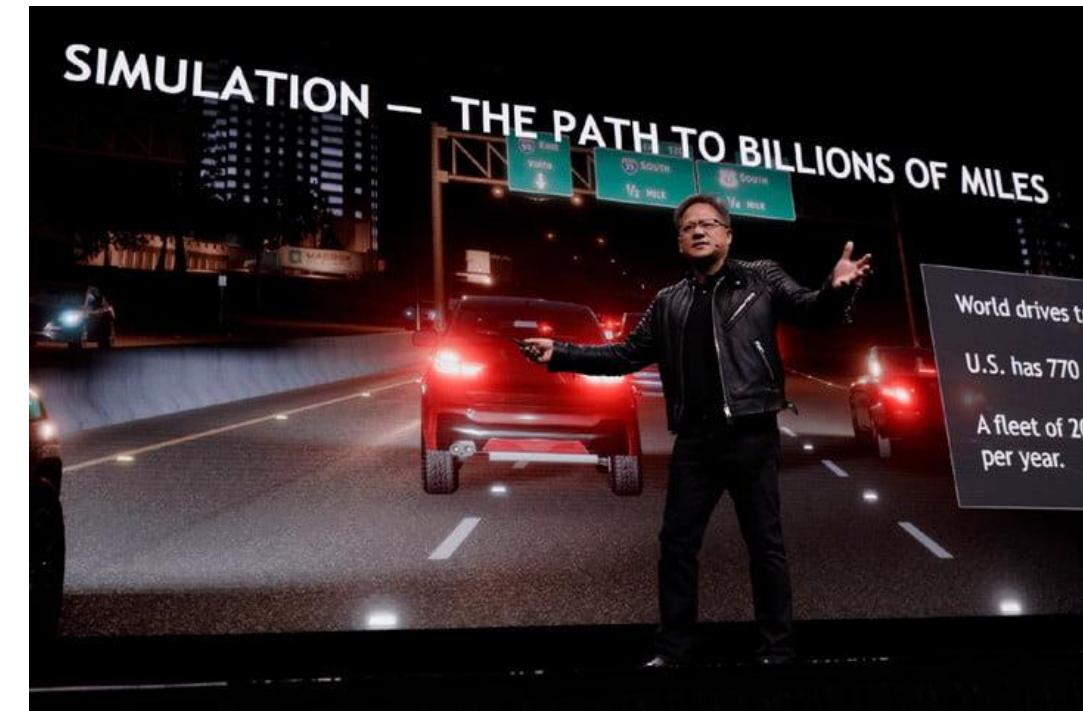
Using chi-square test from: [http://reliabilityanalyticstoolkit.appspot.com/mbf\\_test\\_calculator](http://reliabilityanalyticstoolkit.appspot.com/mbf_test_calculator)

# WHY SIMULATION FOR AV VALIDATION ?

- The number of scenarios to validate controls will explode from SAE automation level 1 to level 5. Physical testing only is no longer feasible.
- “14.2 billion miles of testing is needed”  
*Akio Toyoda, CEO of Toyota  
Paris Auto Show 2016*

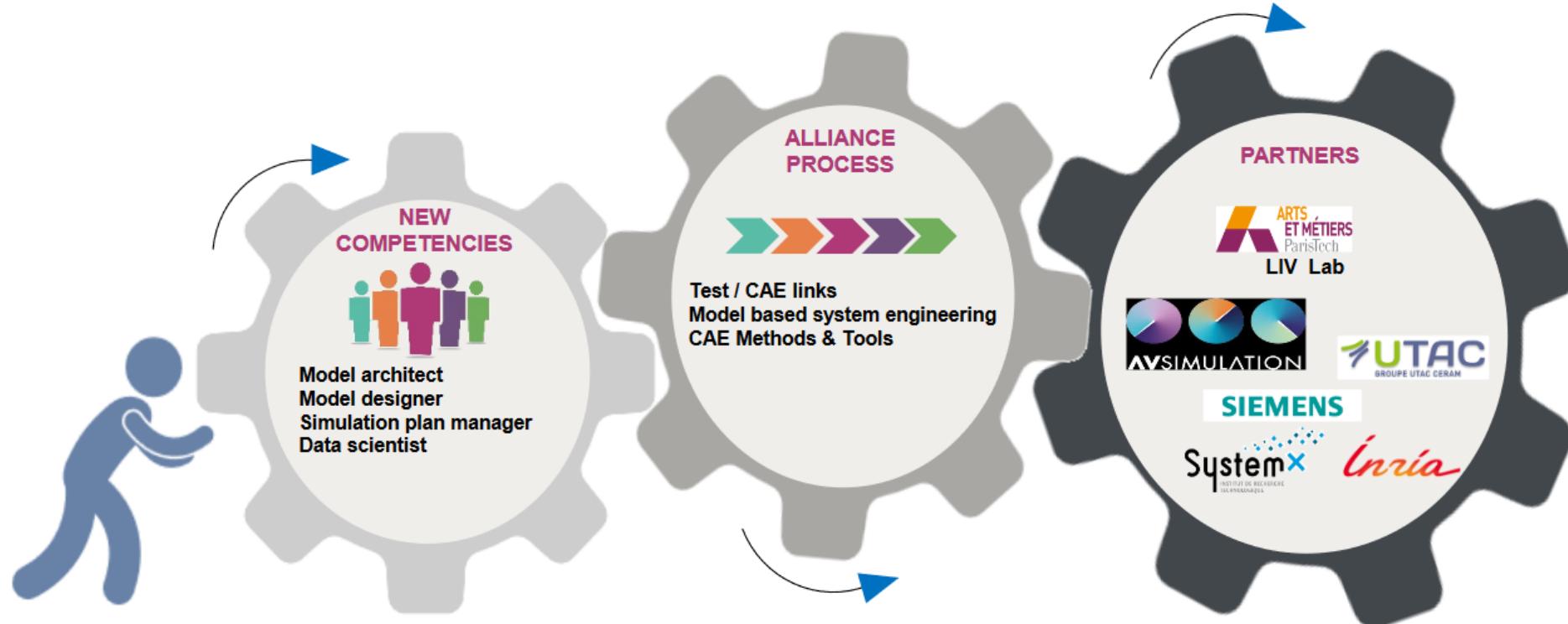


# WHY SIMULATION FOR AV VALIDATION ?



# WHY SIMULATION FOR AV VALIDATION ?

## AD SIMULATION ECO-SYSTEM



**Simulation and Driving simulator are key to develop and validate new connected and autonomous vehicles**



OLIMIER COLMARD

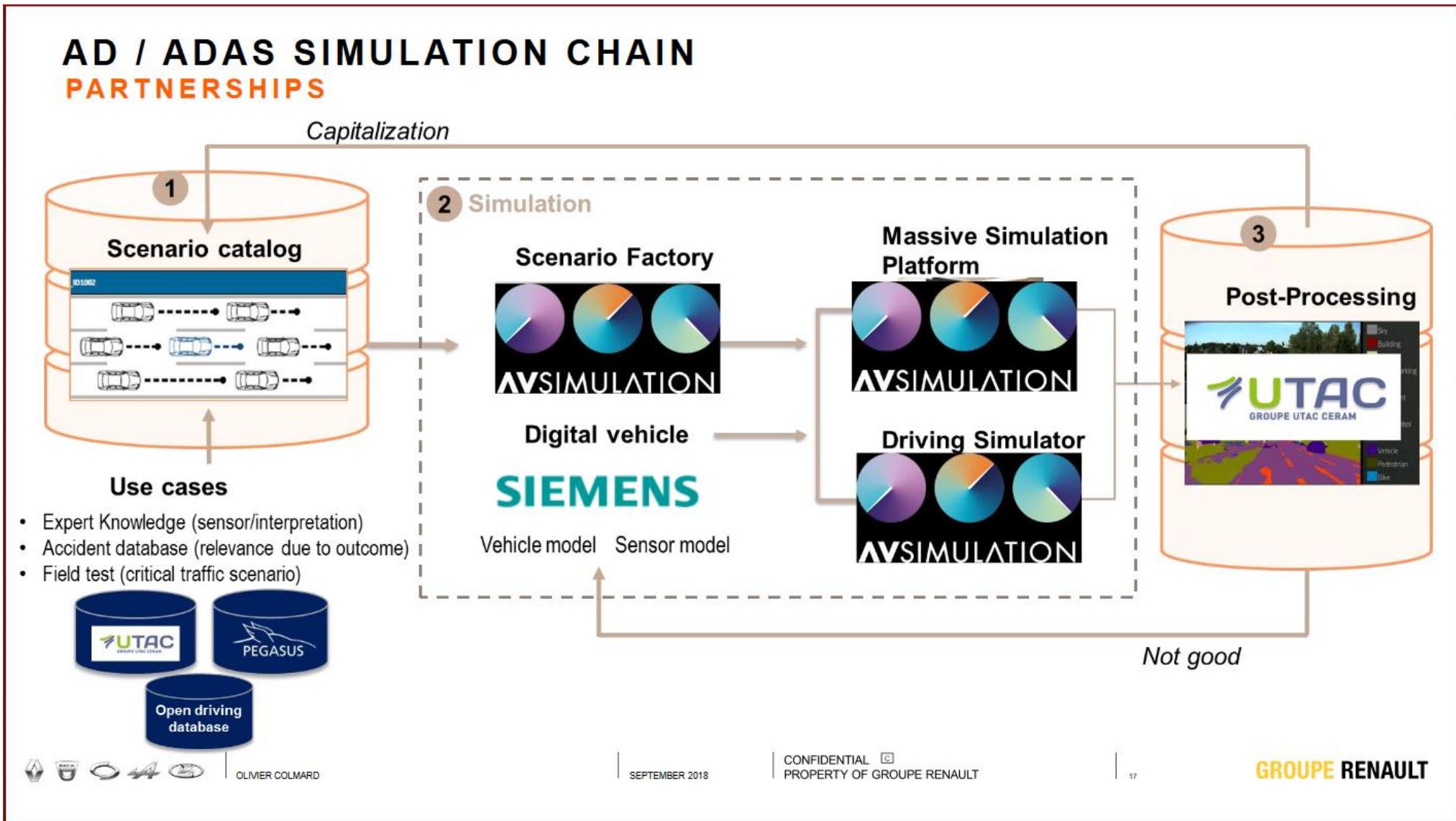
SEPTEMBER 2018

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26

GROUPE RENAULT

# WE ARE THE BACKBONE OF RENAULT AD SIMULATION

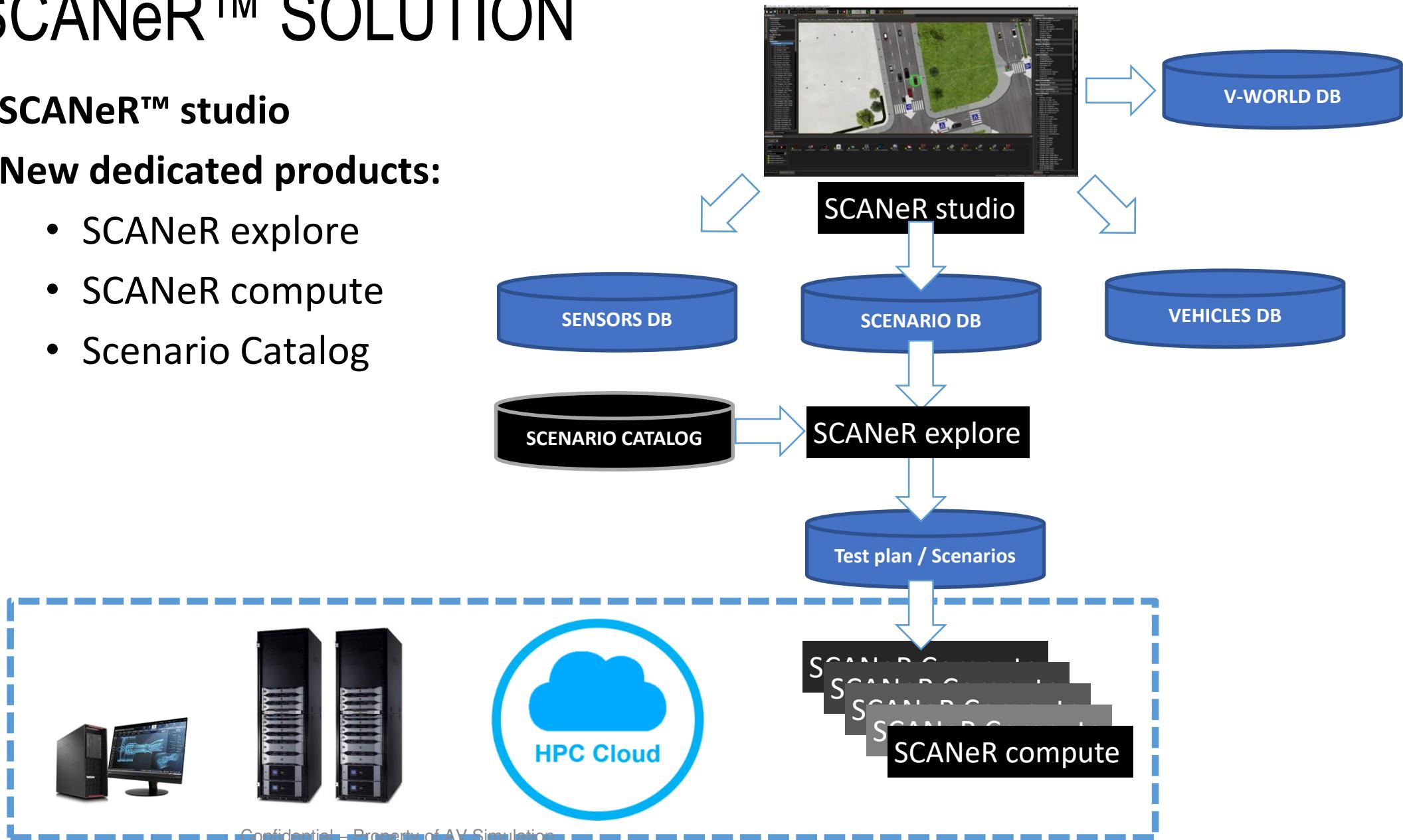


# AV VALIDATION CHALLENGES

- Representative models for the virtual world, sensors, vehicles
- Scenario creation & generation
- Massive parallel execution
- Metrics computation

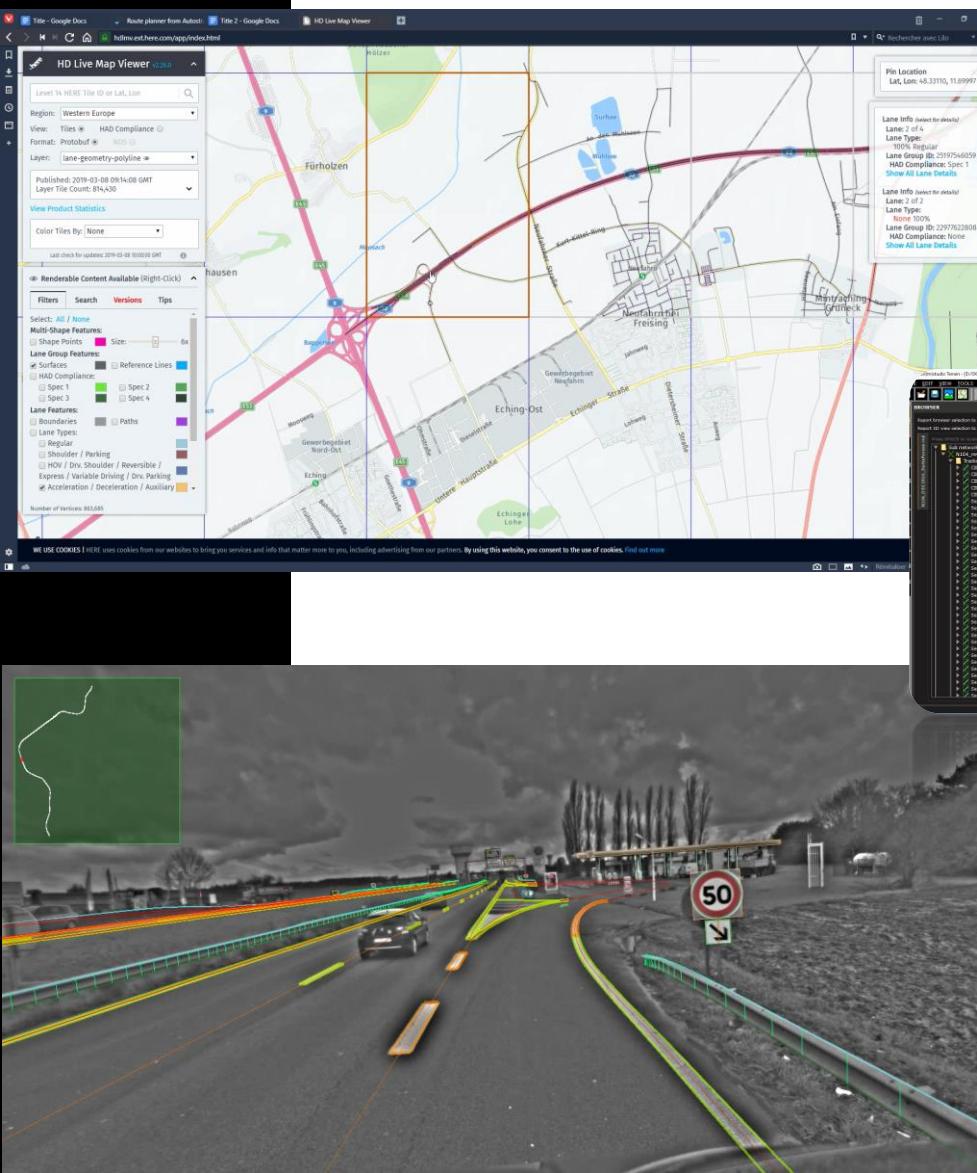
# SCANeR™ SOLUTION

- **SCANeR™ studio**
- **New dedicated products:**
  - SCANeR explore
  - SCANeR compute
  - Scenario Catalog

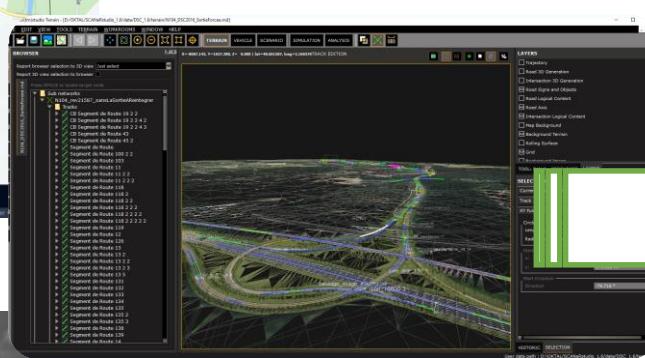
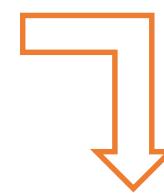


# Representative models for the Virtual world, sensors, vehicles

# BUILD A DIGITAL WORLD



HD Maps



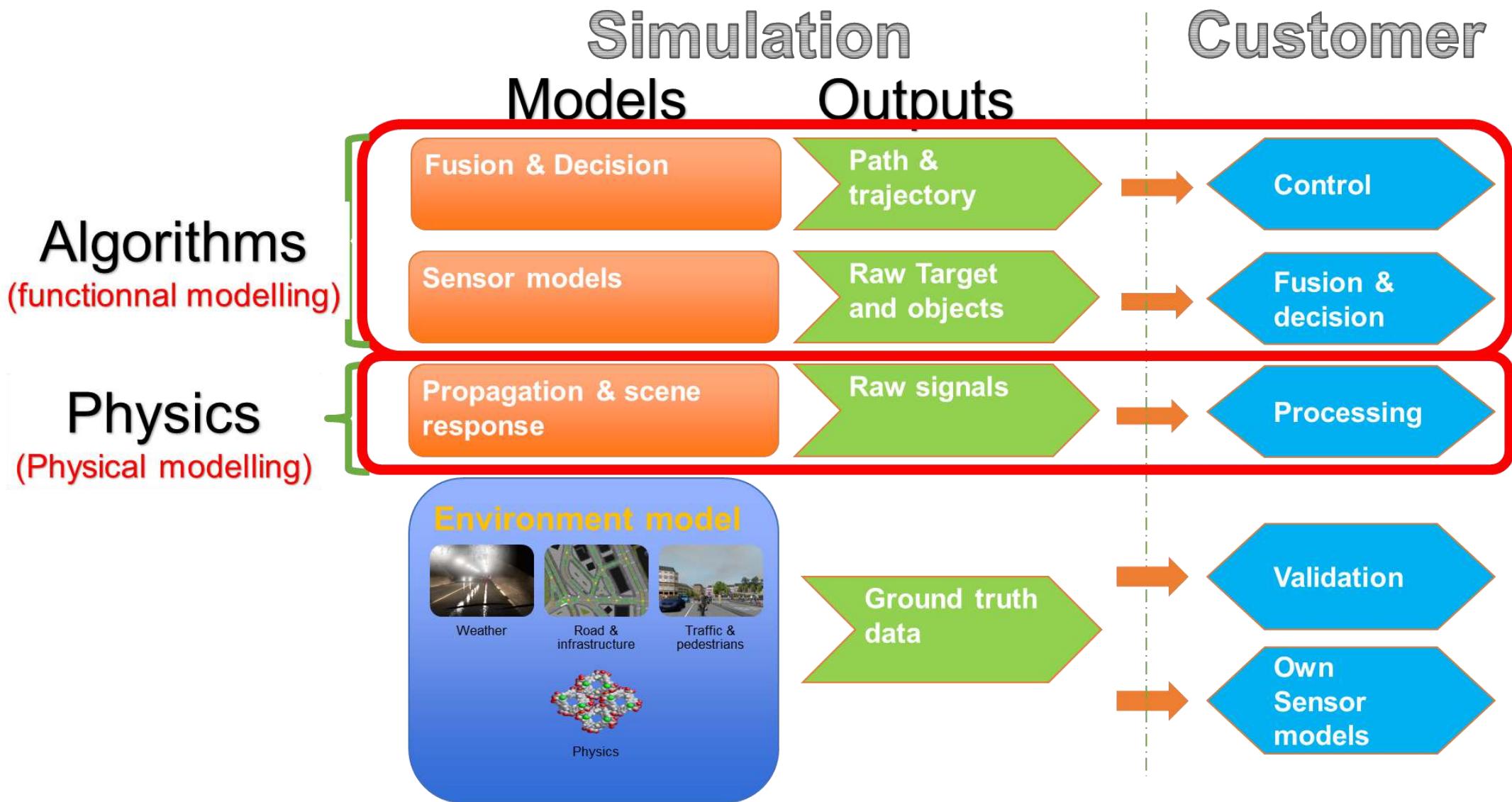
SCAneR™ studio : Terrain



Acquisitions

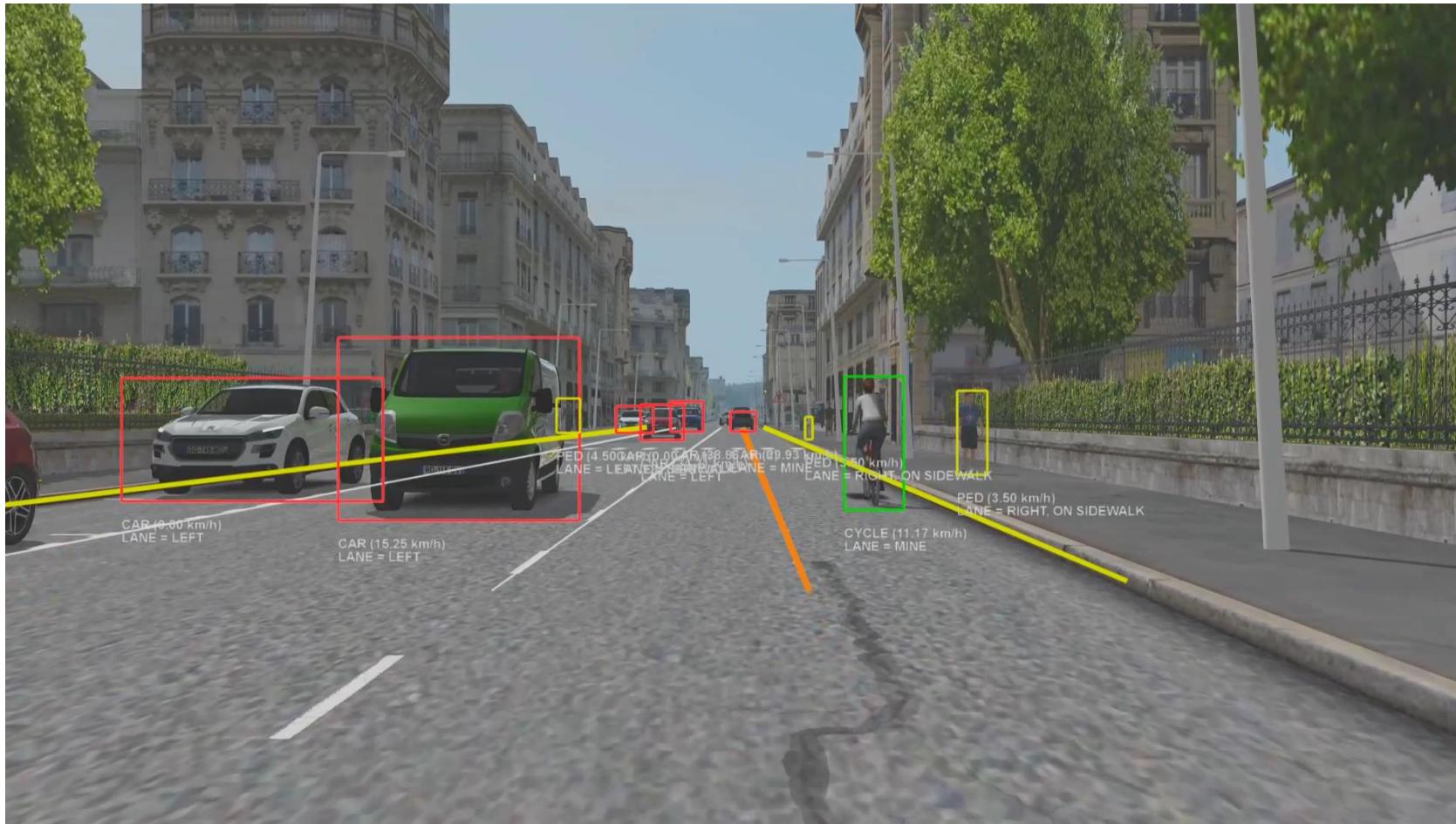


# STRATEGIES FOR SENSOR MODELLING

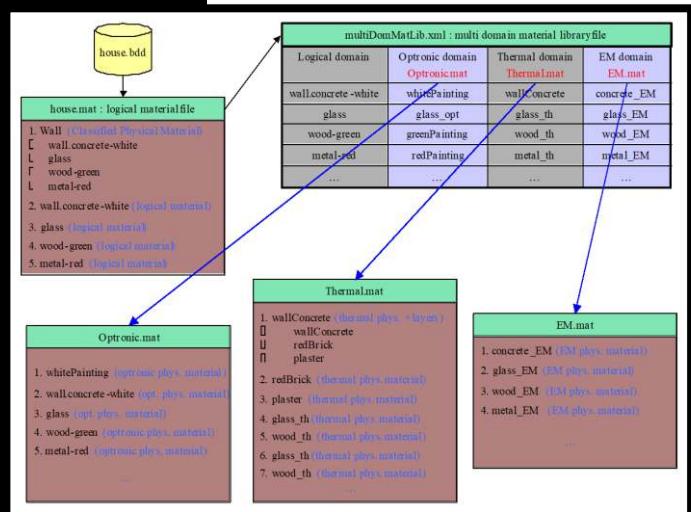
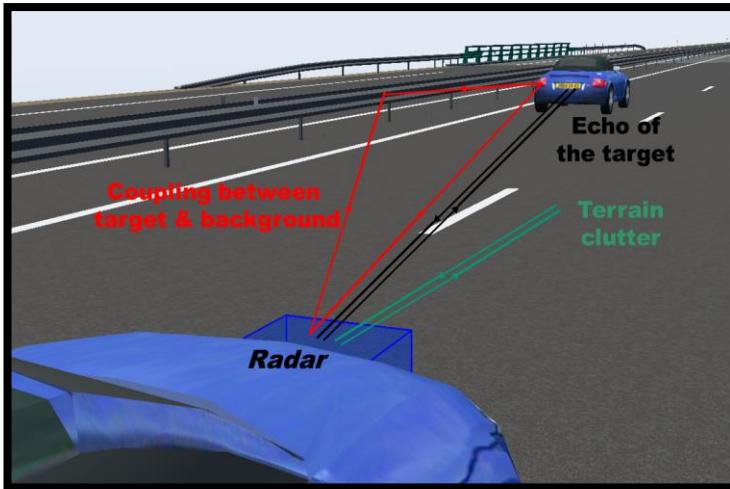
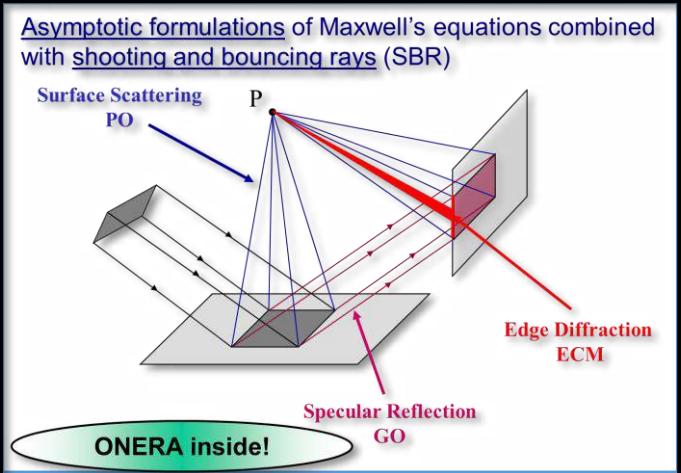


# FUNCTIONNAL MODELLING

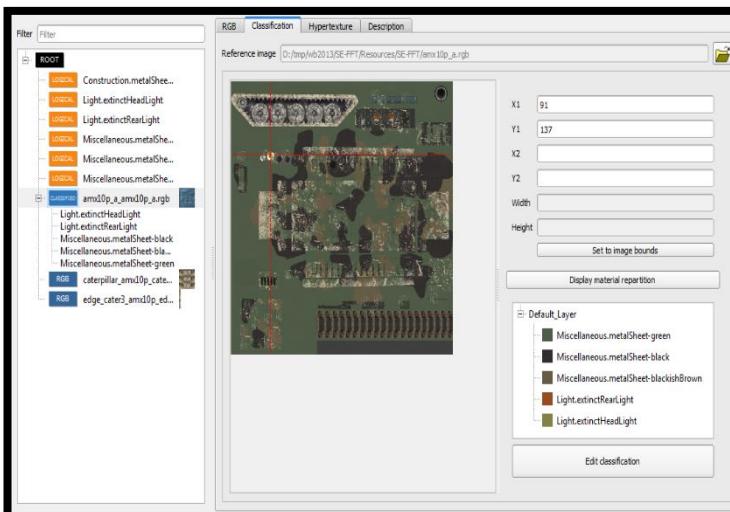
- Simulate the algorithms!



# RADAR SIMULATION AT PHYSICAL LEVEL

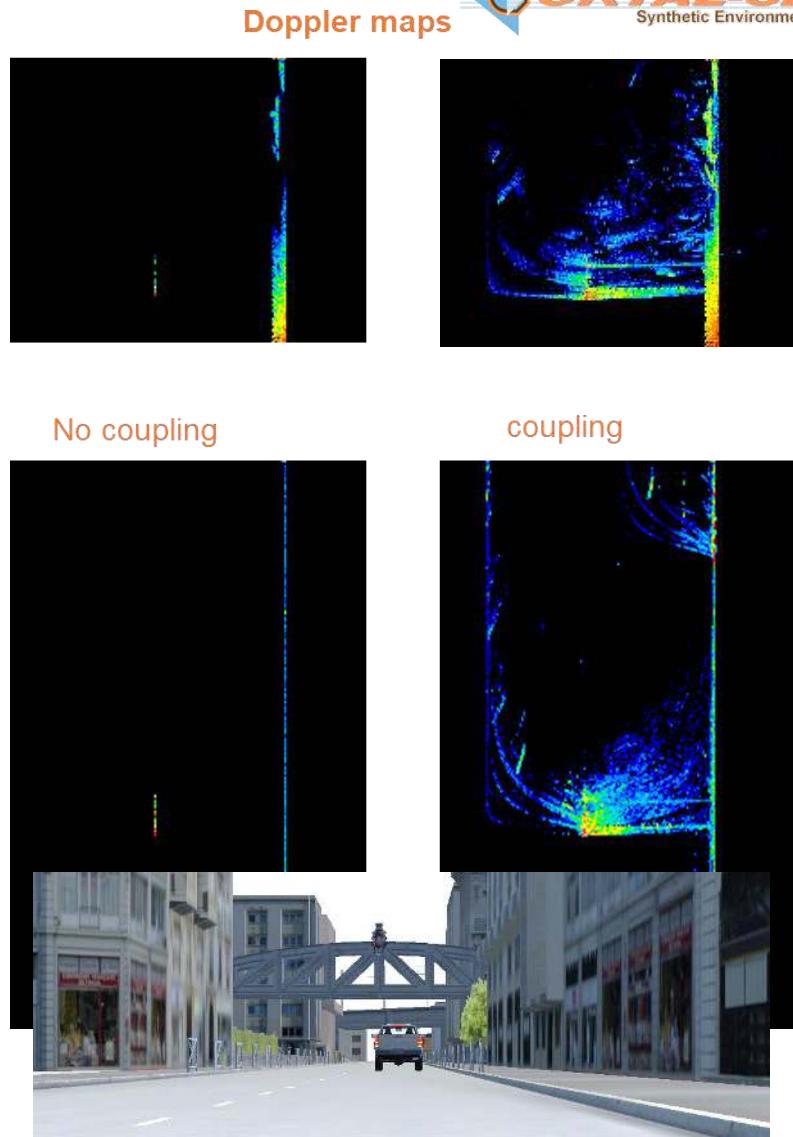


Material database



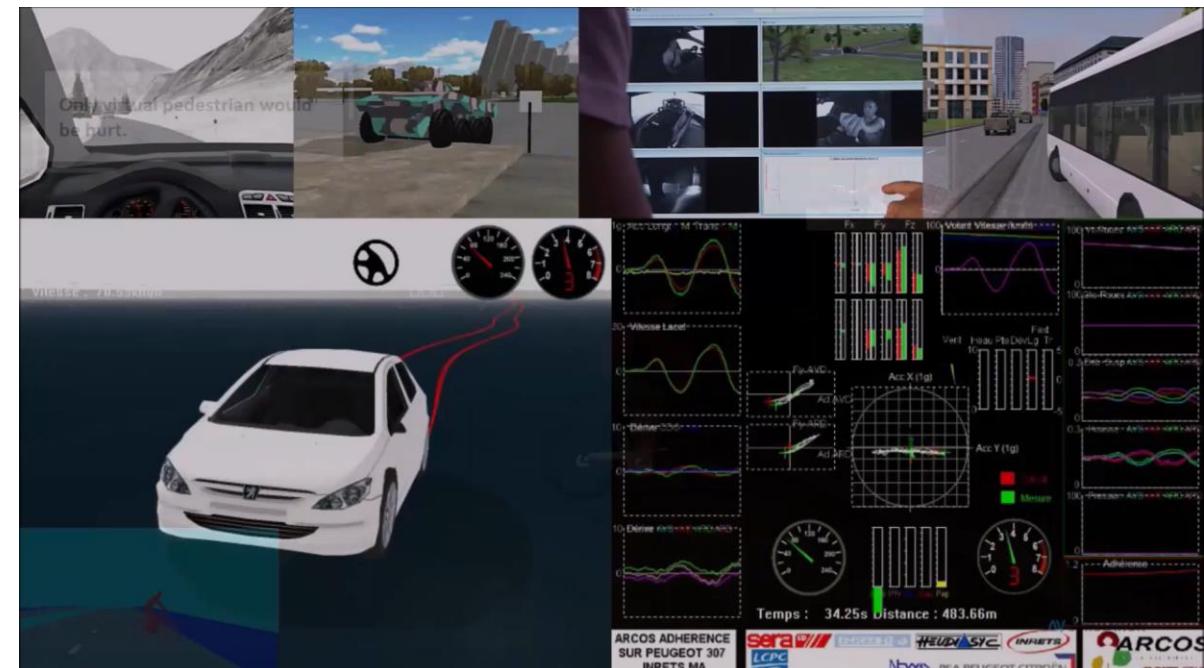
Object classification

Confidential – Property of AV Simulation



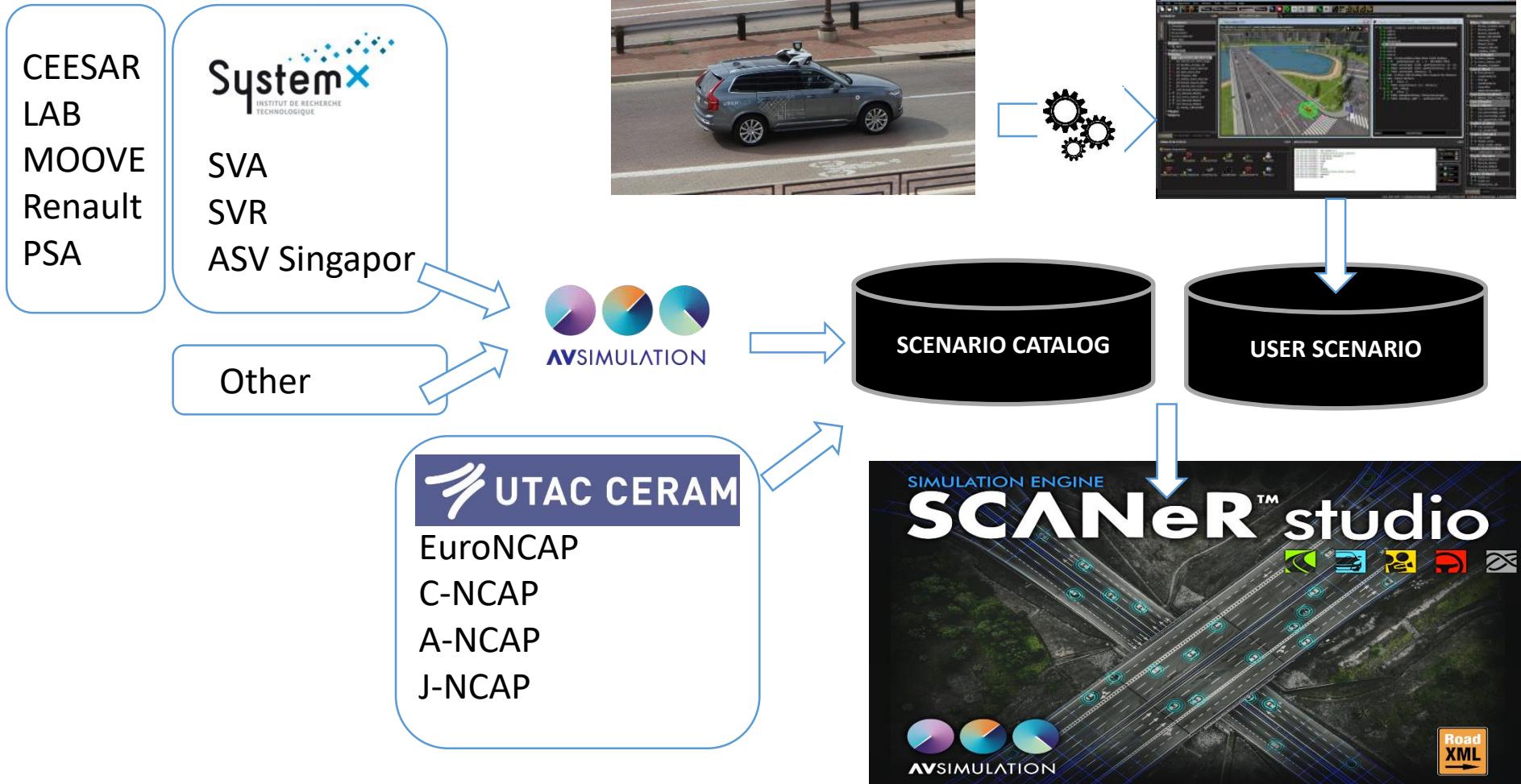
# MODELLING THE VEHICLE

- **SCAneR includes CALLAS model**
  - Validated in a large scope of applications
  - C/C++ & Simulink API + FMI to create external Sub-models
- **Generic interface for Dynamic vehicle models**
  - Custom Simulink model
  - C/C++ API
  - Many models of the market
- **Custom Input/Output to exchange internal data with distributed simulation**
- **FMI support**



# Scenario creation

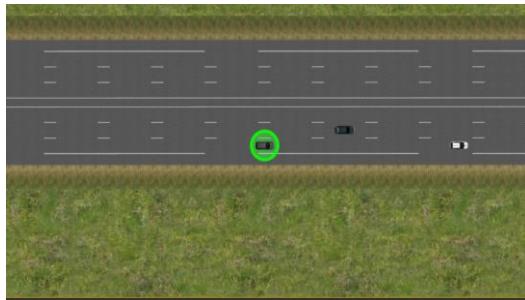
# SCENARIO TOOLS AND CATALOG



# KEY ASPECTS FOR SCENARIO MODELING

- 20 years of expertise of complex interactive scenario
- **Models**
  - Environment (Infrastructure, Roads, Weather)
  - Traffic (Flows, Densities, Types)
  - Vehicle dynamics
  - Drivers (Real, Trajectory, Commands)
  - Maneuvers (Lane following, Lane change, curves)
  - Systems (ADAS, HMI)
- **Scripting**
  - Intensive function library to interact with models
    - *Interrogate*
    - *Take control*
  - Powerful scripting tools

# SCENARIO CATALOG PREVIEW



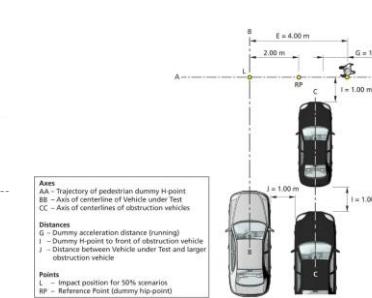
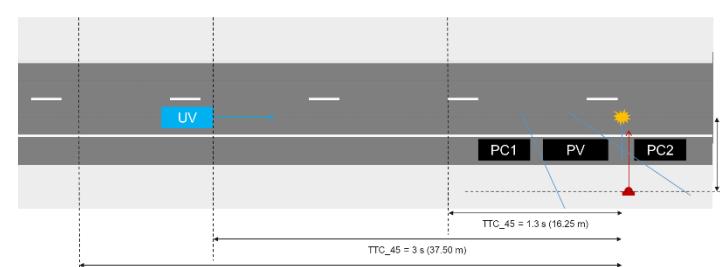
Simultaneous maneuvers

Cut-in



Cut Through

CCRB



CPNC-50 AEB pedestrian

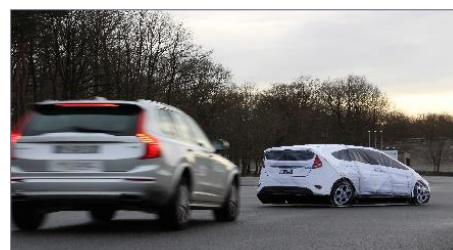
- UTAC CERAM, french laboratory, EuroNCAP accredited
- Physical UTAC CERAM testing expertise implemented into virtual scenarios
- Correlation between real and virtual test



**TEQMO**  
by UTAC CERAM

- Official NCAP scenarios (EuroNCAP, ANCAP...)

Car to car scenarios



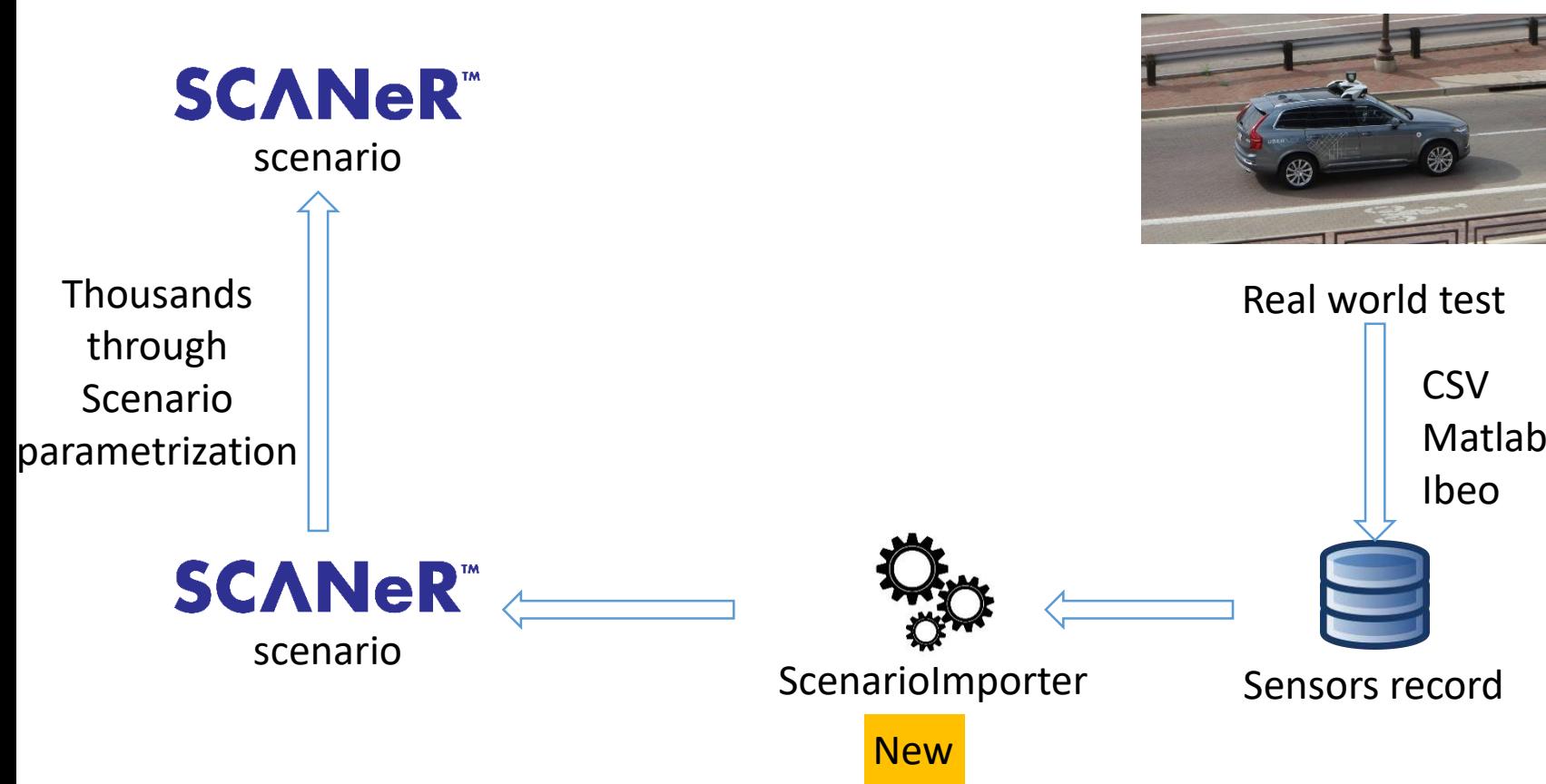
Bicycle scenarios



Pedestrian scenarios



# SCENARIO: IMPORT REAL DATA



# SCENARIO: IMPORT REAL DATA

- **Very sensitive to the data quality**
  - Ego position must be accurate
  - bad detection → bad scenario.
- **Vehicle position and road position matching**

Courtesy of Renault



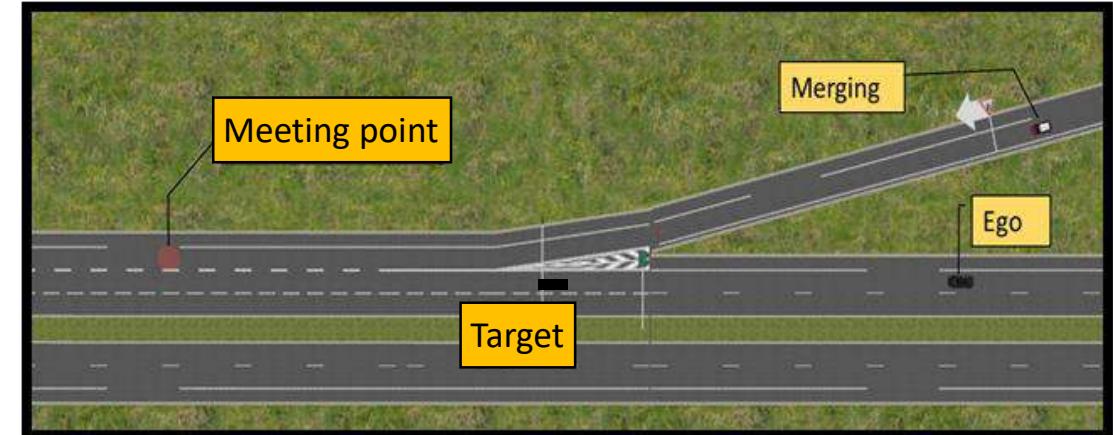
# Scenario generation

# MOTIVATION

- **Parameters:**

- Ego speed
- Merging vehicle acceleration
- Gap at meeting point
- Delta speed at meeting point
- Merging vehicle lane change duration
- Gap with target
- Meeting point abscissa
- Merge lane length
- Slope
- Curvature
- Time of day
- Weather conditions

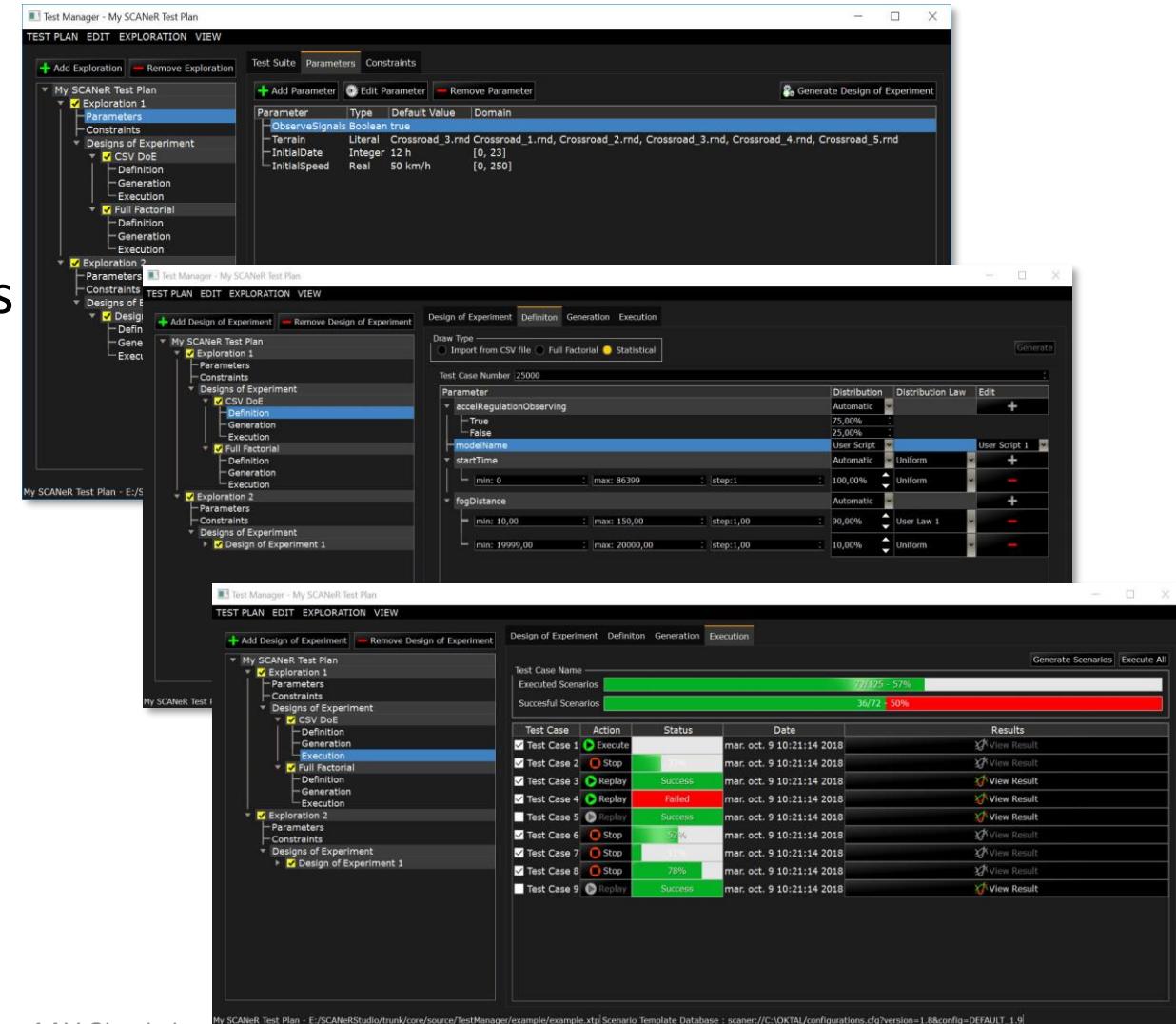
- **5 variations for each → almost 5M scenarios**



**Merging scenario**

# SCANeR explore

- Test plan editor
  - Statistical distribution laws
  - Parameters constraints
  - Support all scenario parameters
  - Customizable with python
- Scenario generator
- SCANeR Compute launcher
- Job monitoring
- Results analysis



# SCANeR explore

- Create test plans & exploration based on scenarios

The screenshot shows the 'Test Manager - New Test Plan' window. The menu bar includes TEST PLAN, EDIT, EXPLORATION, GENERATION, and VIEW. The toolbar has 'Add Exploration' and 'Remove Exploration' buttons. The left sidebar shows a tree structure under 'New Test Plan': 'MyExploration' is selected, showing its children 'Parameters', 'Constraints', 'Designs of Experiment', and 'Design of Experiment 1'. 'Design of Experiment 1' has children 'Definition', 'Generation', and 'Execution'. A 'User Script' node is also listed. The right panel contains tabs for 'Test Suite', 'Parameters', 'Constraints', and 'User Scripts'. The 'Test Suite' tab is active, displaying the following configuration:

Name	MyExploration
Scenario Template	`\${STUDIO_PATH}/SCANE Rstudio_1.9/data/DEFAULT/scenario/Studio_3DObjects.sce`
Scenario	`\${STUDIO_PATH}/SCANE Rstudio_1.9/data/DEFAULT/scenario/Studio_3DObjects.sce`
Description	(empty)

A status message at the bottom says 'Enabled' with a yellow icon.

# SCANeR explore: SCENARIO GENERATION

Test Manager - New Test Plan

TEST PLAN EDIT EXPLORATION GENERATION VIEW

+ Add Design of Experiment - Remove Design of Experiment

New Test Plan

- MyExploration
  - Parameters
  - Constraints
- Designs of Experiment
  - Design of Experiment 1
    - Definition
    - Generation
    - Execution
- User Script

Design of Experiment Definiton Generation Execution

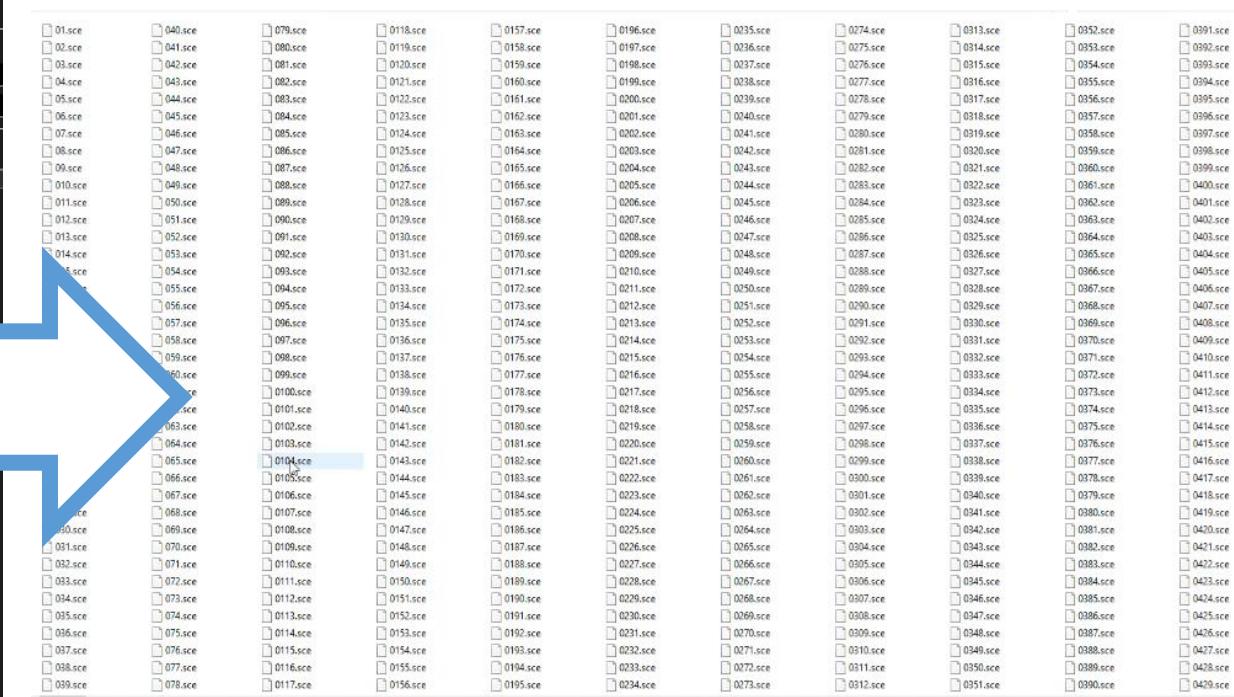
Export Design of Experiment

Scenario Generation

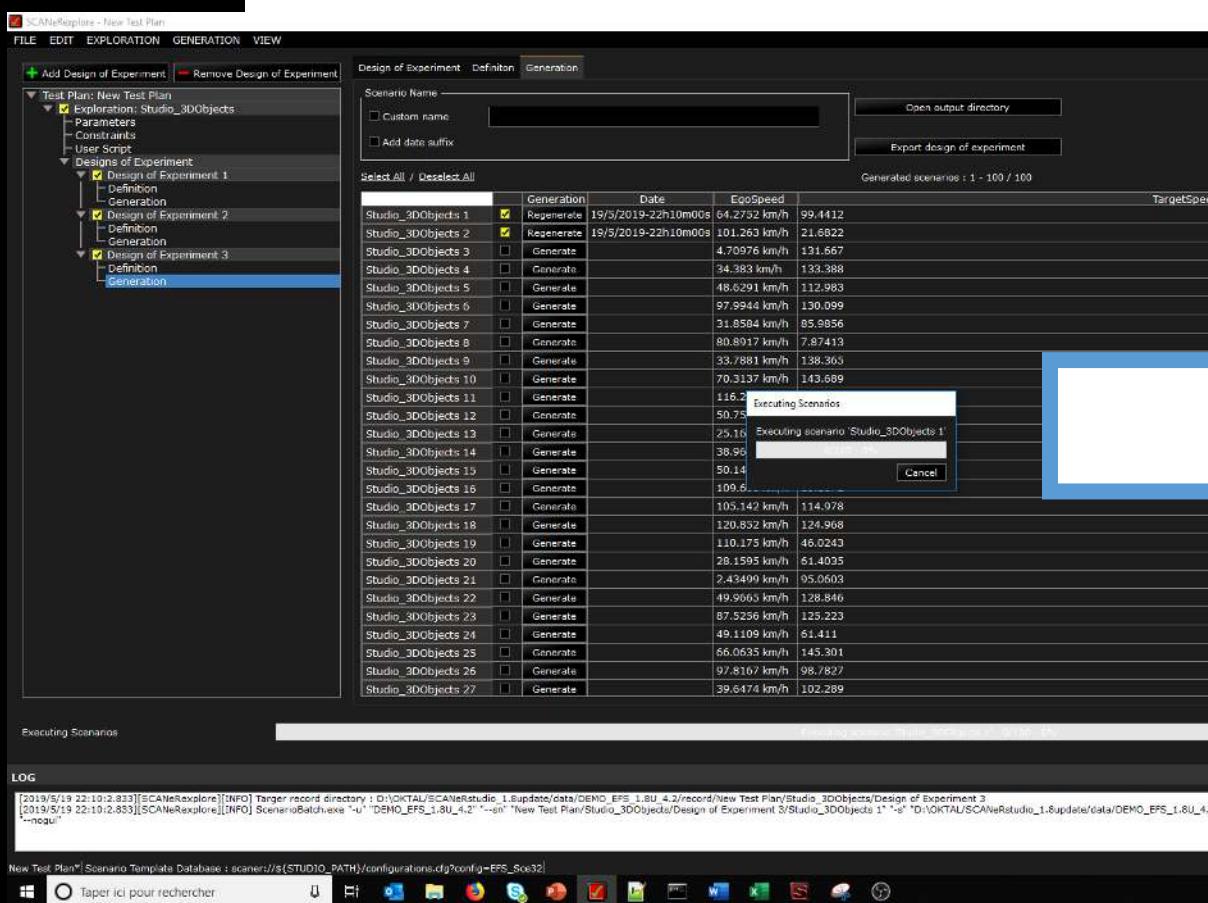
- Add Date Suffix
- Custom Prefix
- Custom Output Directory

Test Case	Scenario	Action	Date	rainLevel	cloudsLevel	initialSpeed	modelName	modelID
Test Case 1	Generate			0	0.2	0 km/h	Citroen_C3_Green	0
Test Case 2	Generate			0	1	0 km/h	Citroen_C3_Green	0
Test Case 3	Generate			0	0.2	10 km/h	Citroen_C3_Green	0
Test Case 4	Generate			0	1	10 km/h	Citroen_C3_Green	0
Test Case 5	Generate			0	0.2	20 km/h	Citroen_C3_Green	0
Test Case 6	Generate			0	1	20 km/h	Citroen_C3_Green	0
Test Case 7	Generate			0	0.2	30 km/h	Citroen_C3_Green	0
Test Case 8	Generate			0	1	30 km/h	Citroen_C3_Green	0
Test Case 9	Generate			0	0.2	40 km/h	Citroen_C3_Green	0
Test Case 10	Generate			0	1	40 km/h	Citroen_C3_Green	0
Test Case 11	Generate			0	0.2	50 km/h	Citroen_C3_Green	0
Test Case 12	Generate			0	1	50 km/h	Citroen_C3_Green	0
Test Case 13	Generate			0	0.2	60 km/h	Citroen_C3_Green	0
Test Case 14	Generate			0	1	60 km/h	Citroen_C3_Green	0
Test Case 15	Generate			0	0.2	70 km/h	Citroen_C3_Green	0

No task are currently running



# SCANeR Explore: SCENARIO EXECUTION & REPORT



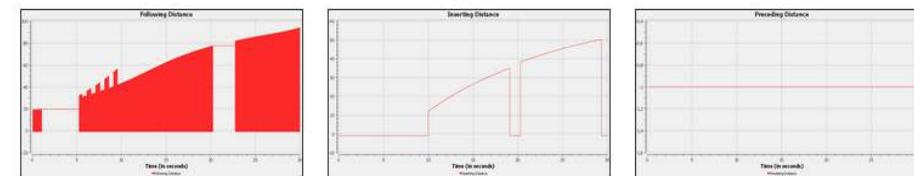
Scenario : highway\_insert 1

Simulation Infos :	
Real duration	0.798723
Real time ratio	37.66
Simulated duration	30
Step done	600

Scenario criteria :	
TEST GREEN	
TEST YELLOW	
TEST RED	
TEST GRAY	

Scenario output variables :	
Dist_Following	-1.000000
Dist_Inserting	-1.000000
Dist_Preceding	-1.000000

Graphs :



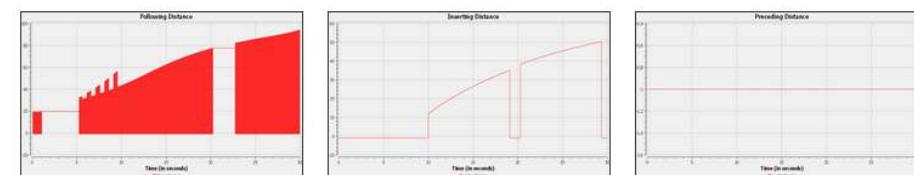
Scenario : highway\_insert 2

Simulation Infos :	
Real duration	0.821878
Real time ratio	36.5018
Simulated duration	30
Step done	600

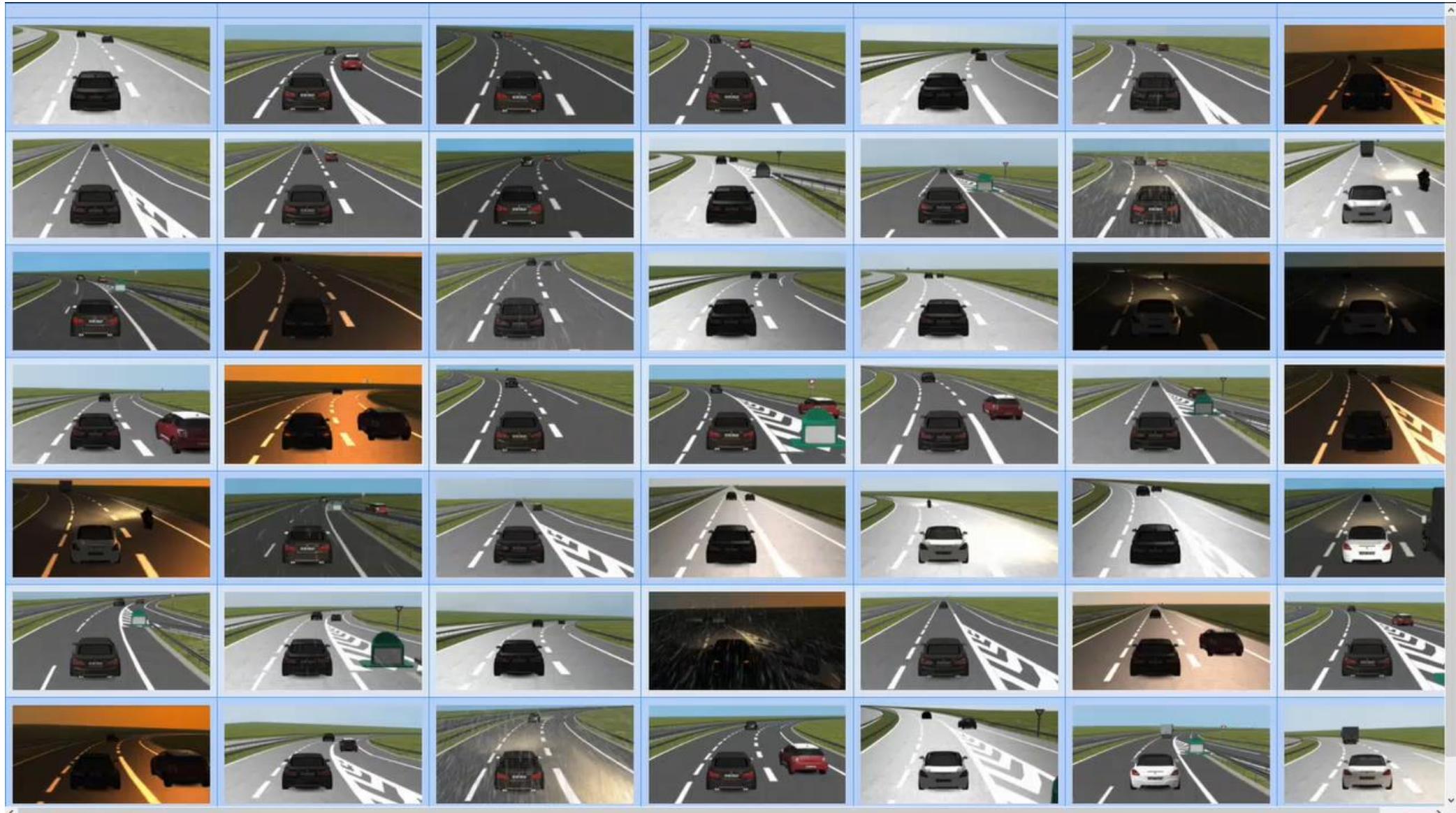
Scenario criteria :	
TEST GREEN	With a very very very lots of criteria info
TEST YELLOW	With criteria info
TEST RED	With criteria info
TEST GRAY	With criteria info

Scenario output variables :	
Dist_Following	-1.000000
Dist_Inserting	-1.000000
Dist_Preceding	-1.000000

Graphs :



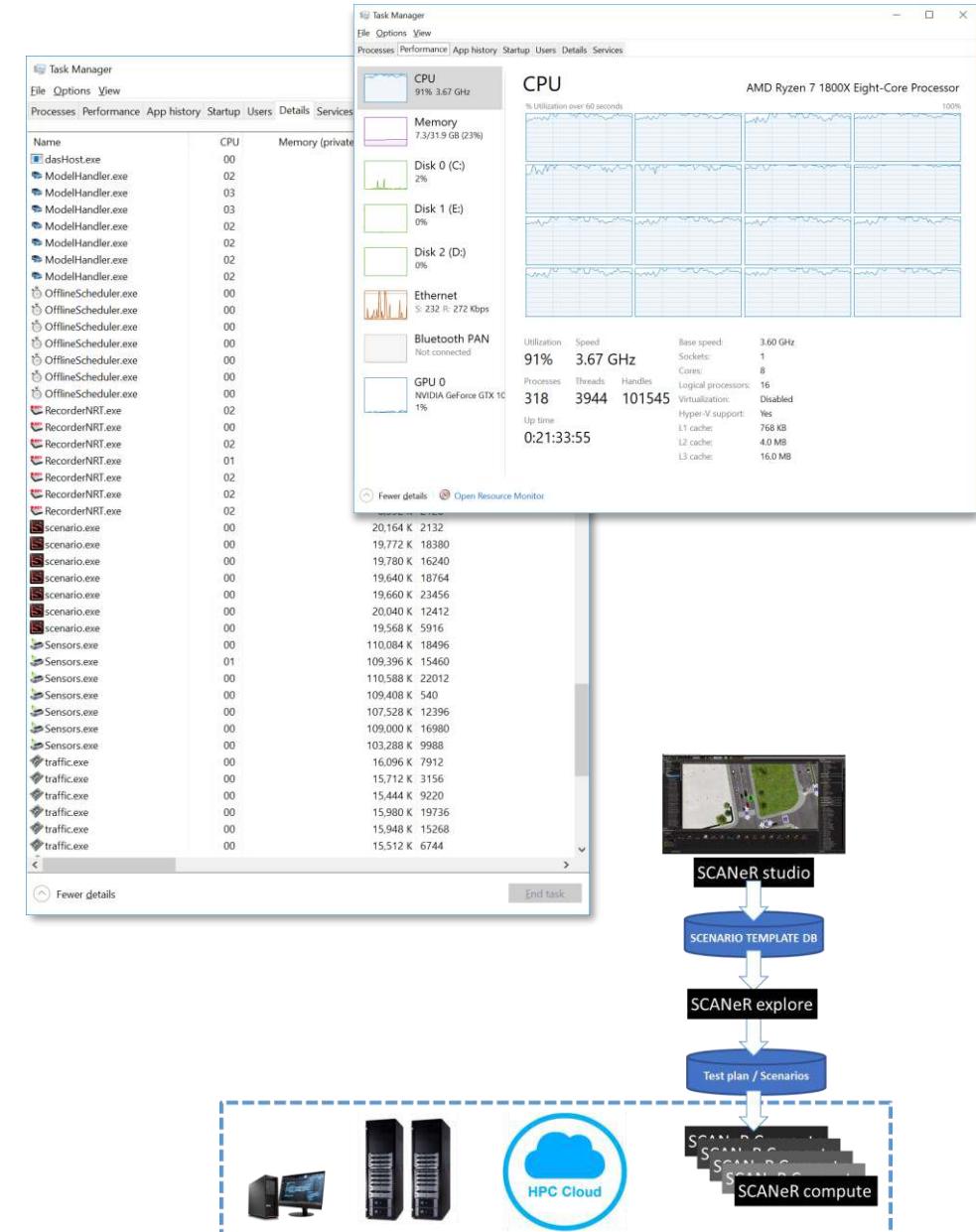
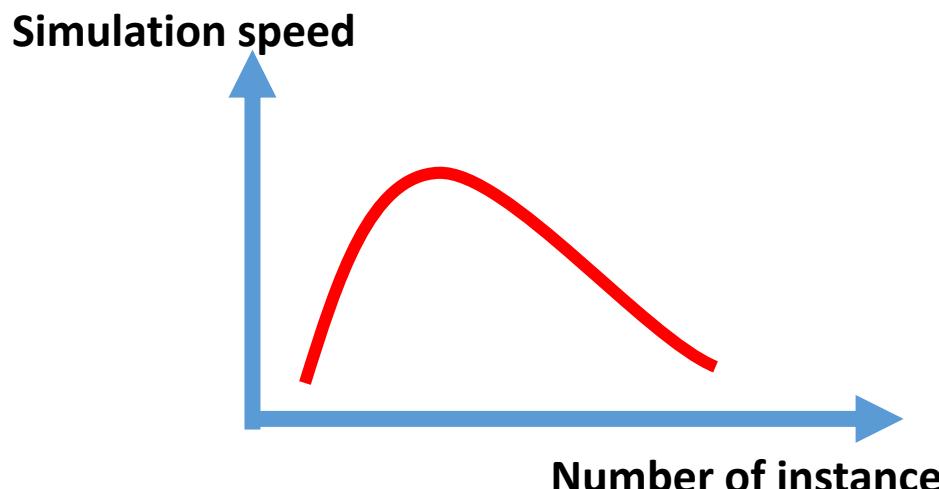
# SCENARIO GENERATION



# Massive parallel execution

# SCANeR compute

- Solver version of SCANeR
  - Easy to deploy
  - Multiple instances on the same node
  - Windows (Pro/Server)
  - Linux (Ubuntu LTS/CentOS 7)
  - Compatible with standard job scheduling tools (LSF, PBS, ...)



# MASSIVE SIMULATION IN THE CLOUD

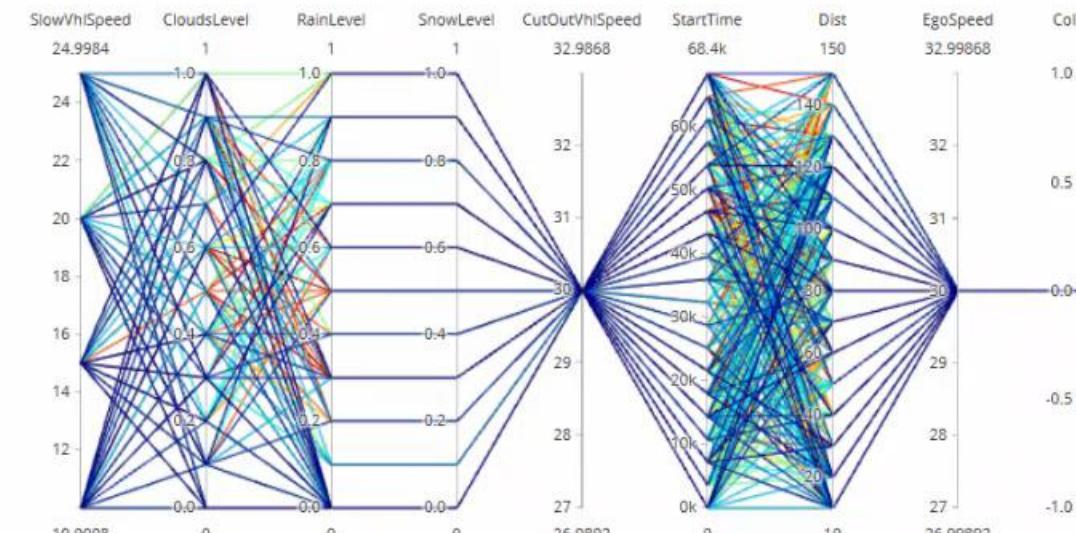
**AVS Cloud Simulation Monitoring Dashboard**

AVSIMULATION Microsoft Partner Azure

Start Stop Clear

500 scenarios played, 1570 km simulated today

Parallel coordinate graph for scenario parameters :



SlowVhSpeed: 24.9984, CloudsLevel: 1, RainLevel: 1, SnowLevel: 1, CutOutVhSpeed: 32.9868, StartTime: 68.4k, Dist: 150, EgoSpeed: 32.99868, Collision: 1

Parallel coordinate graph for scenario parameters :

Last 10 Minutes

Graphs Heatmap Available nodes Running tasks Application Insights

Configuration Nodes

Pool has no nodes

AvsPoolDemo standard\_d2s\_y3, steady Last resized 4 hours ago Custom image (windows)

1 USD 0.12/h

No tags

idle (0) running (0) waitingforstarttask (0) offline (0) preempted (0) Transition states creating (0) starting (0) rebooting (0) reimaging (0) leavingpool (0) Error states starttaskfailed (0) unusable (0) unknown (0)

100 video thumbnails showing simulation runs.

# Results

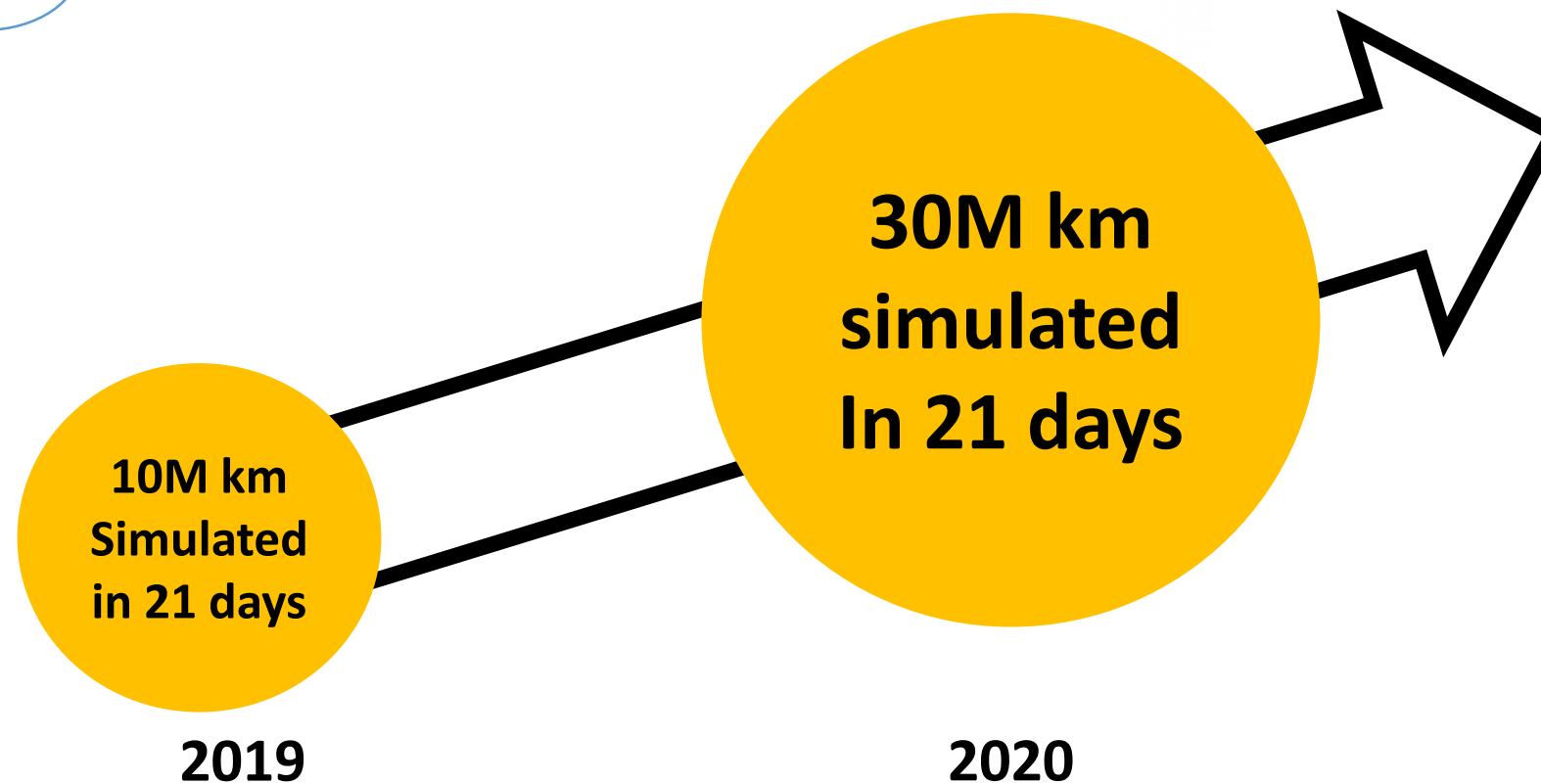
# MASSIVE SIMULATION @ GROUPE RENAULT



is deployed on Renault HPC  
infrastructure and cloud powered by



Microsoft  
Azure



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[www.avsimulation.fr](http://www.avsimulation.fr)



**Thank you**

