



Scenario-based Modeling and Simulation

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- New challenges in AV/ADAS development
 - Exponentially growing software complexity driven by advanced control features
 - Paradigm shift in vehicle Verification & Validation environment
- Some core capabilities needed to address those challenges
 - Model based system engineering is the rescue of system complexity
 - Fully digital tool chain
 - Scenario modeling
 - Large scale cloud computing
- Case study – Scenario simulation through Simulink/CARLA co-simulation
- Future work

Growing software complexity driven by safety features



“A modern car contains around 100 million lines of software code. To become fully autonomous, an estimated 10X increase is required – that’s a staggering 1 billion lines of code. To put that in perspective, one of the world’s most advanced fighter aircraft, the F-35, contains around 10 to 20 million lines of code.” – sourced from [Ansys](#)

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1950 – 2000
Safety/Convenience Features

- Cruise Control
- Seat Belts
- Antilock Brakes

2000 – 2010
Advanced Safety Features

- Stability Control
- Blind Spot Detection
- Forward Collision Warning
- Lane Departure Warning

2010 – 2016
ADAS Features

- Rearview Video Systems
- Automatic Emergency Braking
- Rear Cross Traffic Alert
- Lane Centering Assist

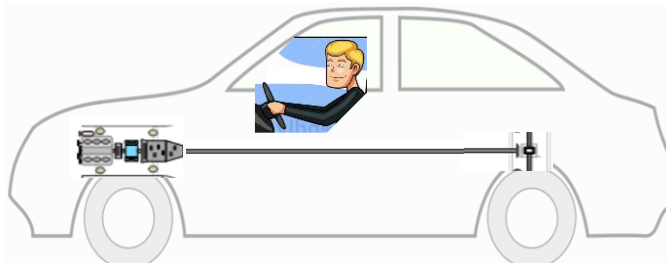
2016 – 2025
Partially Automated Safety Features

- Lane Keeping Assist
- Adaptive Cruise Control
- Traffic Jam Assist

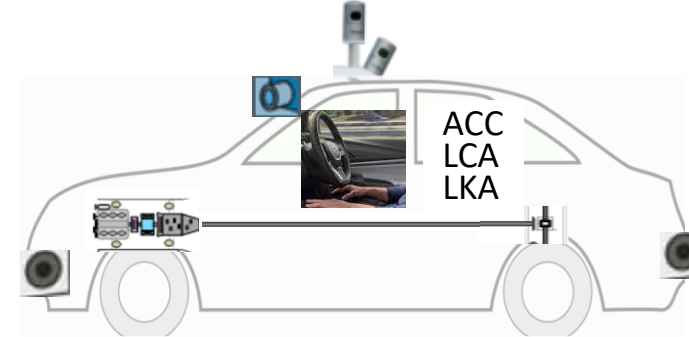
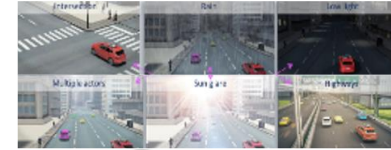
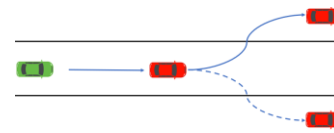
2025+
Fully Automated Safety Features

<https://www.nhtsa.gov/technology-innovation/automated-vehicles-safety#the-topic-safety-timeline>

Paradigm shift from traditional vehicle V&V to AV/ADAS V&V



- For **traditional vehicle**, all driving decisions are made by human driver
- Vehicle development focuses on vehicle itself, such as powertrain, chassis, etc.
- Interaction with other vehicles are not considered

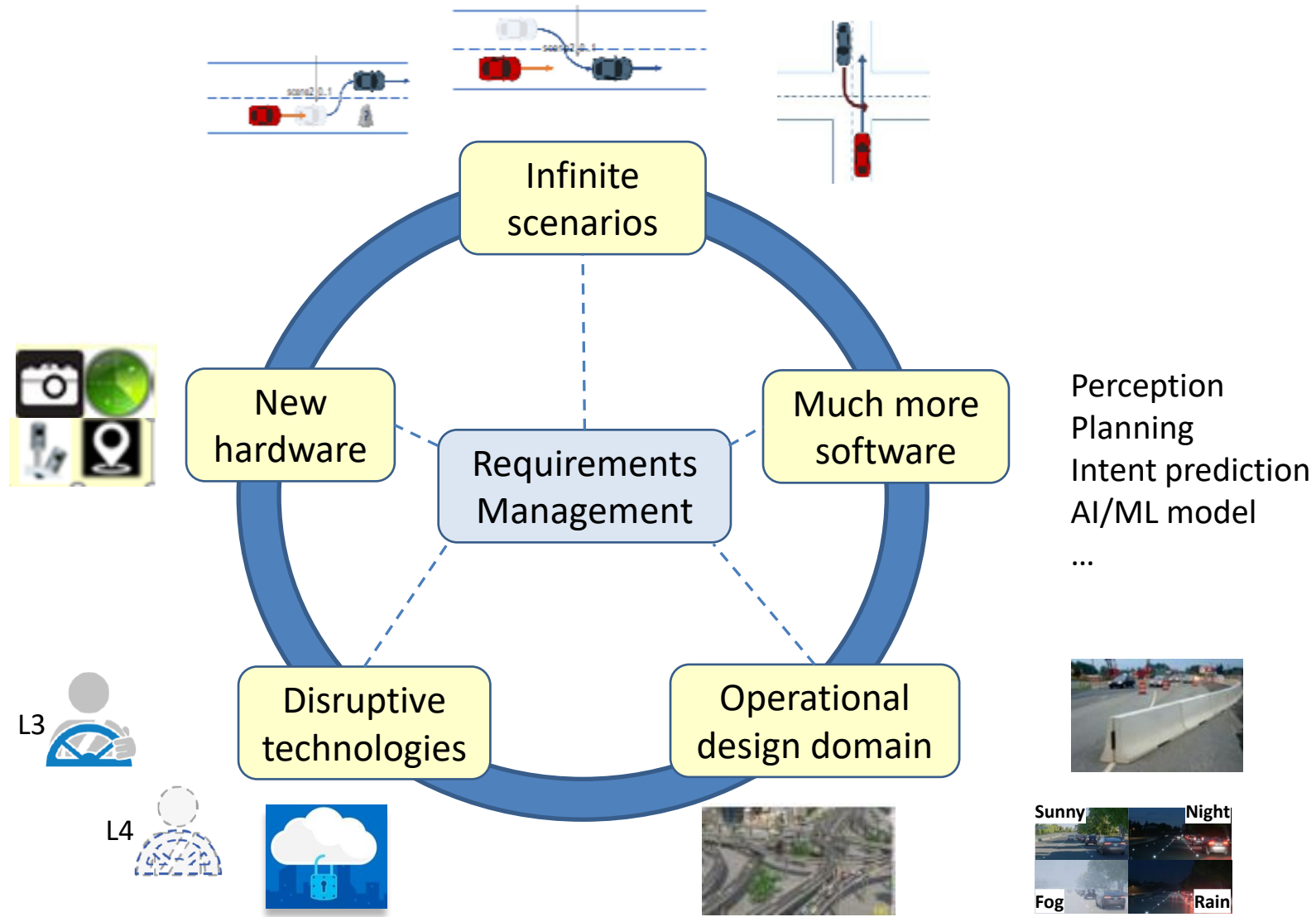


- For **ADAS/AV**, part of or all driving decisions are made by computer
- Interaction with other vehicles and environment are critical
- Vehicle development extends from vehicle boundary to include interaction with all elements in operational design domain

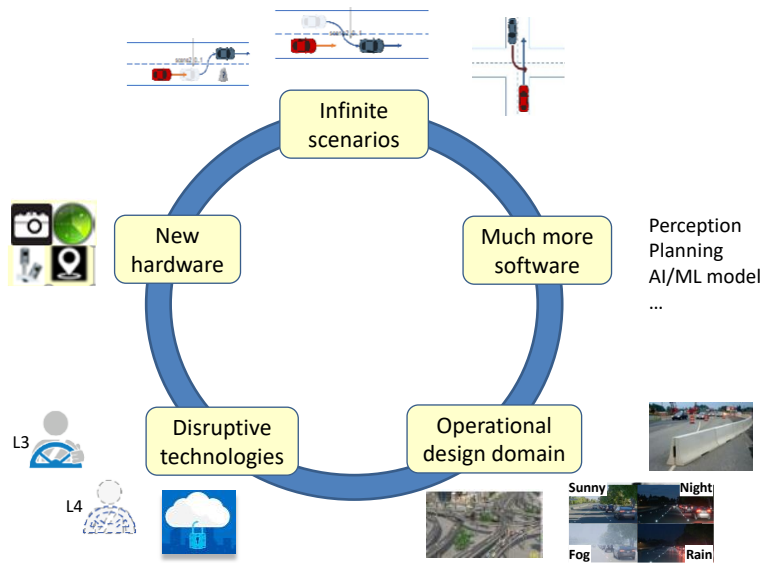


AV/ADAS Vehicle development crosses traditional vehicle body boundary, which introduces infinite variations into V&V

Complexities coming from all ways



Challenges to vehicle development



- “1 billion lines of code needed” – sourced from Ansys
- “275m miles testing are required for self-driving car” – *source 1
- “1.95m mile tested from Dec 2019 to Nov 2020” -- *source 2
- Perception module and control algorithms are required to test in infinite number of scenarios
- Requirements management
- ...

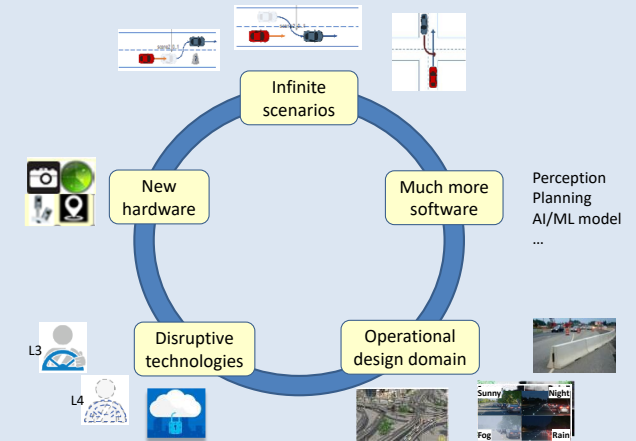
Requirements management complexity, scenario complexity, and number of miles required for V&V present a real challenge for product development; however, can physical testing be increased to the order of magnitude to meet the exponentially growing V&V needs?

1. <https://www.statista.com/chart/7009/self-driving-cars-are-on-their-way/>
2. <https://www.statista.com/chart/17144/test-miles-and-reportable-miles-per-disengagement/>

Problem Statement

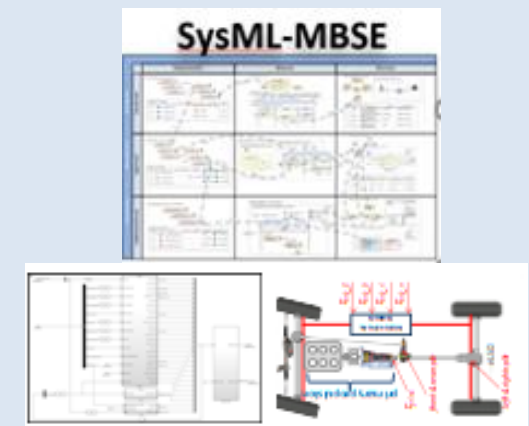
Challenges

- Rapid technology advancement and exponentially growing complexity.
- Complex interface and interactions.
- Late change is costly and causing program delay.
- Robustness verification requires extensive testing.
- Test is critical but cannot hope to increase testing by the order of magnitude needed for growing complexity.



Opportunity

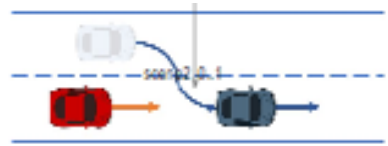
- System engineering helps to identify and solve problem at early design phase
- The use of simulation can address our inability to test everything
- Deep integration beyond hardware level by including driver/vehicle/environment interaction is the way to deliver safe and robust products



Fully digital toolchain

Scenario identification

- Data mining
- Scenario extraction
- Scenario statistics
- Scenario database



Identified Scenario

Scenario Contents

Road network



Traffic



Behavior



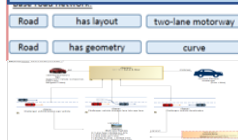
Statistics



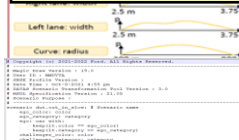
Scenario-based SE

- Abstract/Logical scenario
- Requirements
- Open standards

Abstract Scenario



Logical Scenario



Scenario Description

Open standards

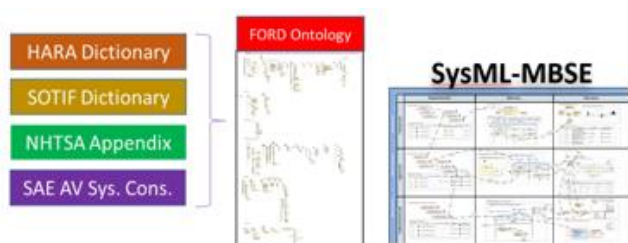
MagicDraw plugin

Concrete Scenario Model

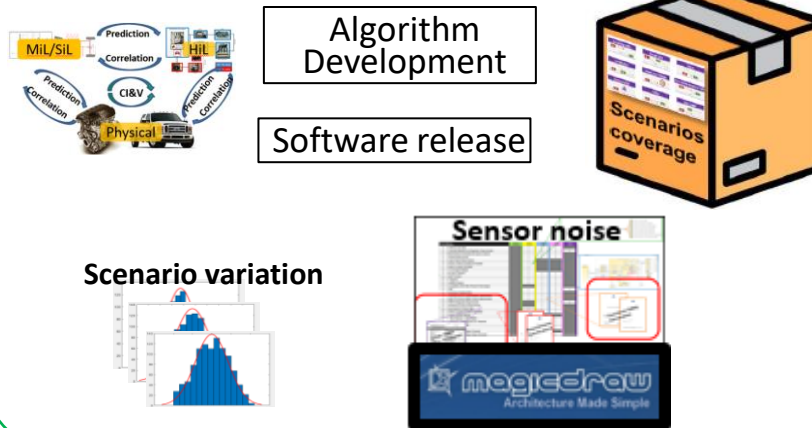
- Low fidelity for algorithm development
- High fidelity for perception module development



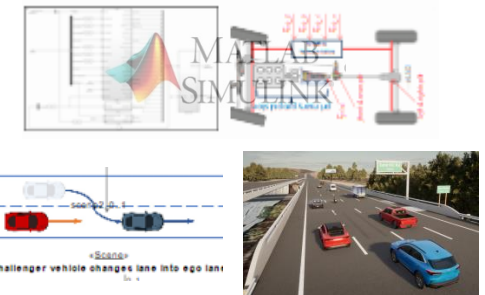
Feature Requirements



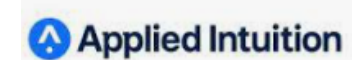
V&V



Scenario Integration with Vehicle Model



Vehicle dynamics and Scenario simulator



Open standards

- **OpenLABEL**
 - Object and scenario labelling format
- **OpenODD**
 - ODD description format
- **OpenXOntology**
 - Extendable domain ontology for OpenX
- **OpenSCENARIO**
 - Dynamic scene description
- **OpenDRIVE**
 - Static road network
- **OpenCRG**
 - Detailed Road surface description
- **Open Simulation Interface**
 - Generic interface between sensor models & ground truth

Source: https://wiki.eclipse.org/images/e/ee/2020-08-18_OpenADX-SC_ASAM_Simulation_Overview.pdf

Case study – Scenario simulation with Simulink/CARLA co-simulation
enabled by MATLAB/Python Integration



- CARLA is an open-source simulator for autonomous driving and ADAS research, which can simulate different environmental conditions, static/dynamic actors, and maps, *etc.*
- Many prototype controls are developed in Simulink, which need to be verified and validated with different scenarios
- There is a need to run co-simulation between Simulink and CARLA
- MATLAB provides the fundamental integration mechanism that allows co-simulation with CARLA through python API

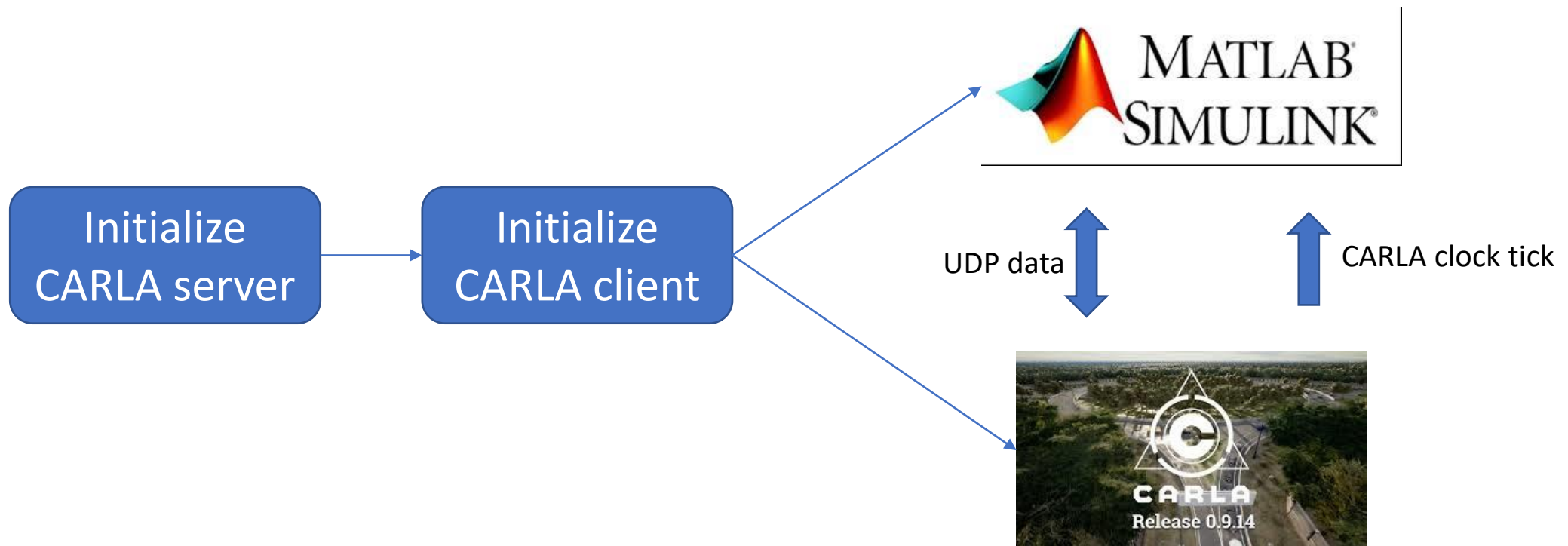


Challenges

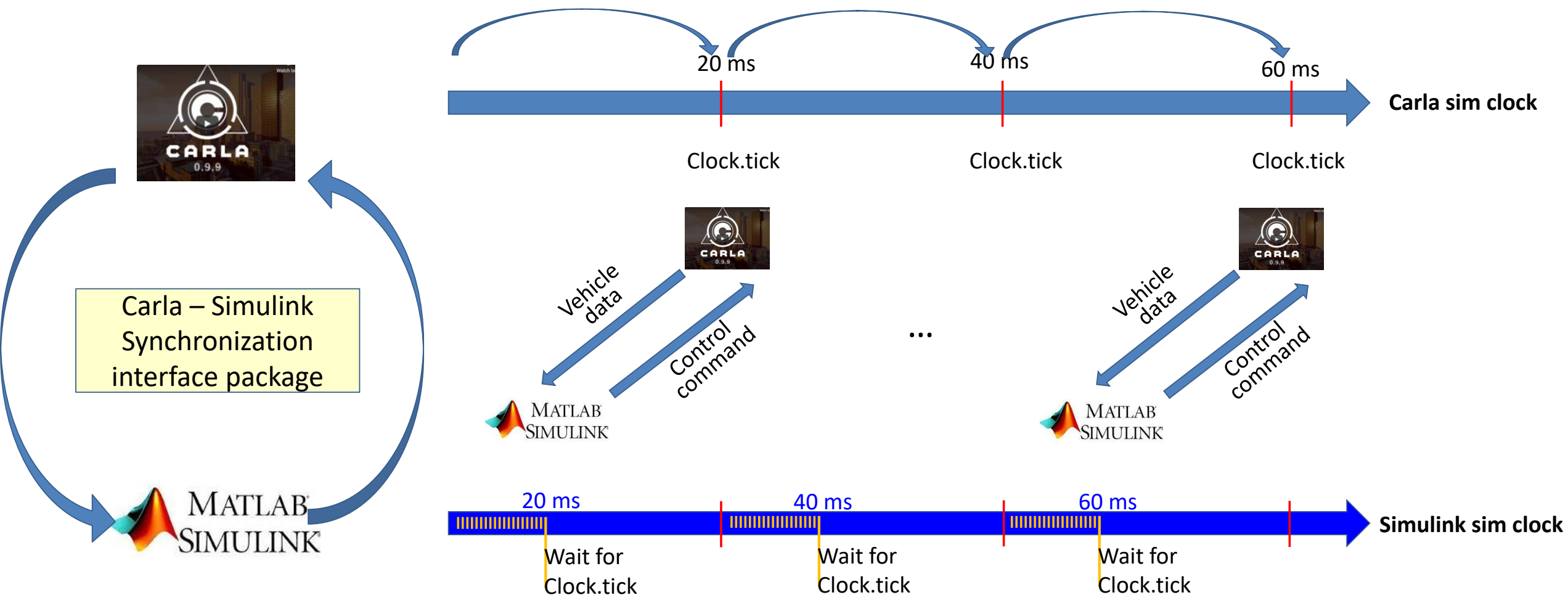
- There is no existing built-in Simulink/CARLA interface block
- Synchronization between Simulink and CARLA since each has its own simulation clock
- How to create road maps for simulation?



- A co-simulation interface package is developed with MATLAB System block in Simulink
- UDP is used for data communication

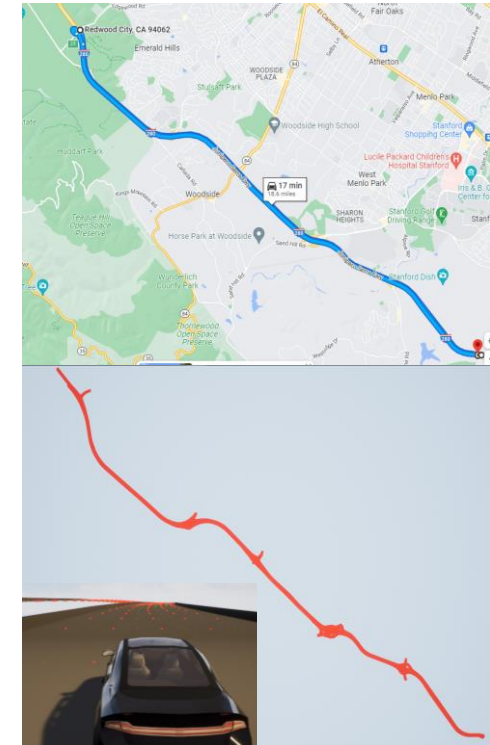
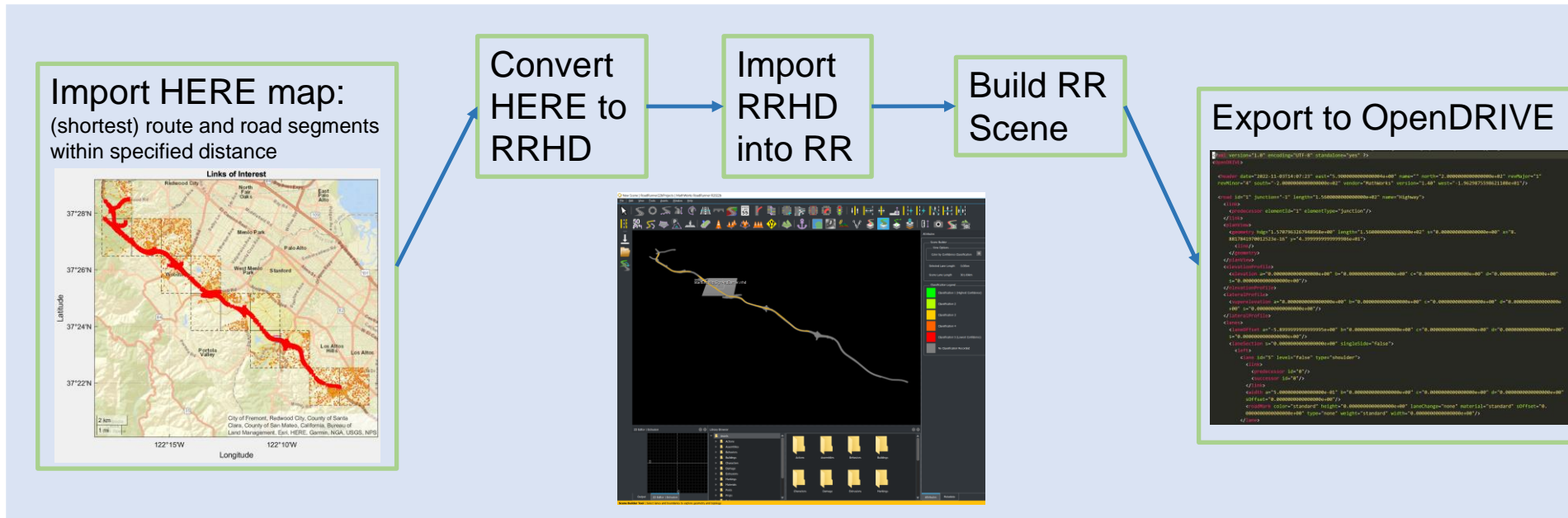


SIMULINK/CARLA Synchronization

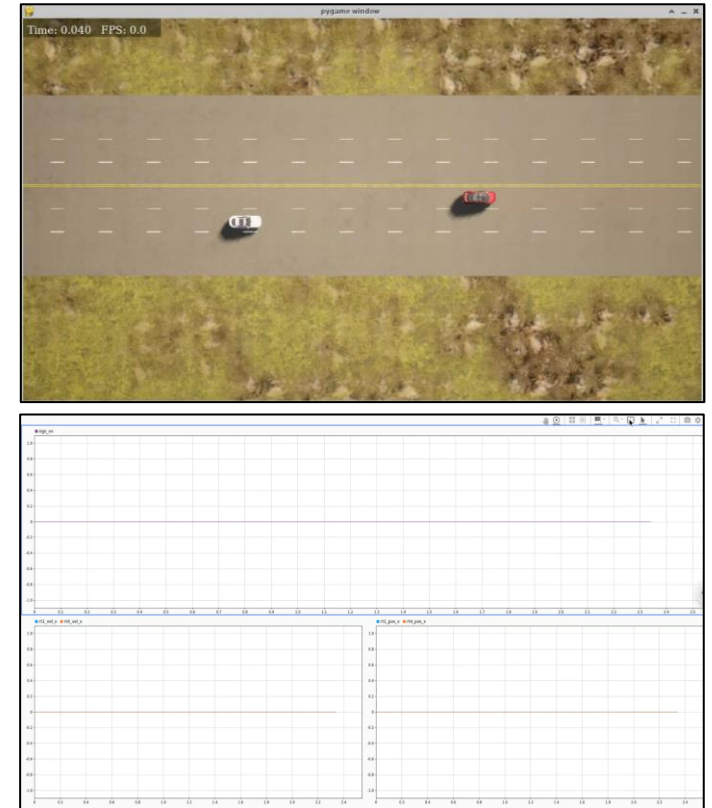
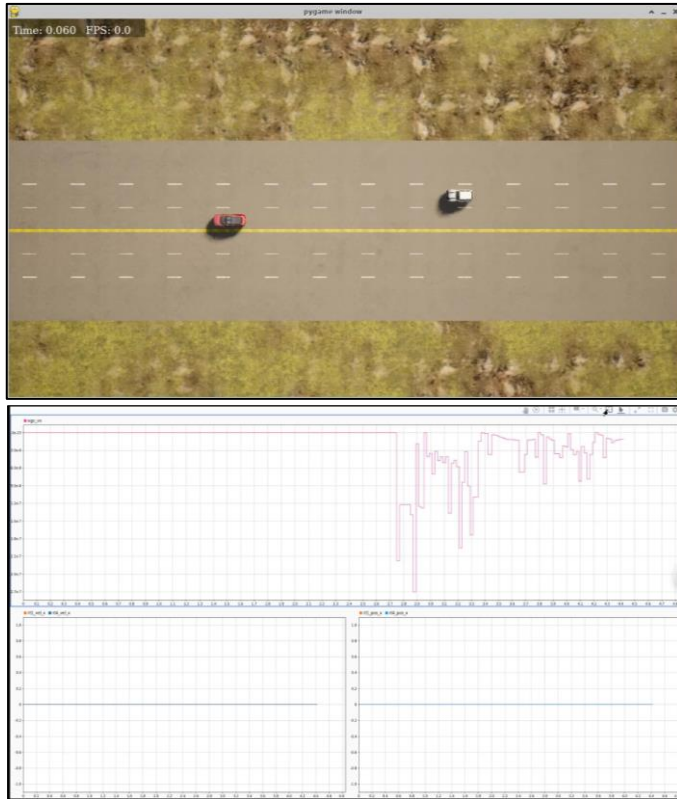


Map creation with Road Runner

- It is required to represent the real-world map accurately in simulation
- Both manual and automated process have been developed to import HERE map into simulation
- Significantly reduced map size for simulation through auto trimming



Scenario examples



Scenario Parameters Example:

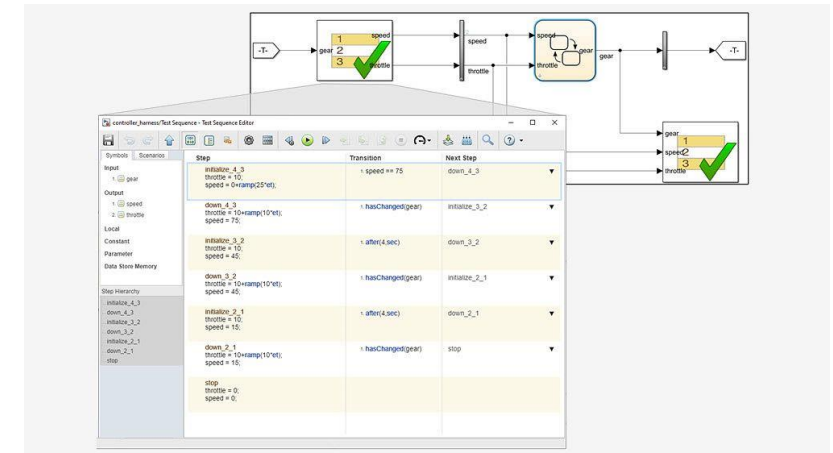
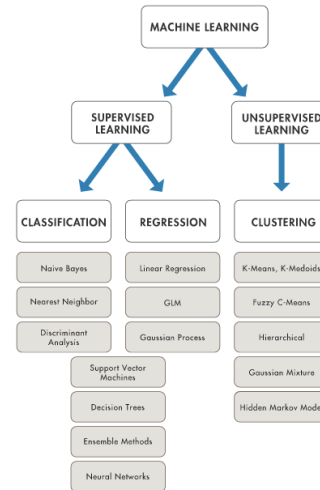
Direction of travel Ego Vehicle Speed
Cut-in Vehicle Speed Cut in Distance
Vehicle Type

- Scenario Design and Co-simulation with RoadRunner Scenario
- AI algorithm integration with Simulink
- Integration with Simulink Test and System Composer

MathWorks

Develop Scenarios for Automated Driving Applications with RoadRunner Scenario

	<p>Design and Simulate Scenarios</p> <ul style="list-style-type: none"> • Design paths and scenario logic • Relocate scenarios to different scenes • Programmatically vary parameters
	<p>Interface with OpenSCENARIO</p> <ul style="list-style-type: none"> • Export to OpenSCENARIO v2.0 • Export to OpenSCENARIO v1.x • Import trajectories from OpenSCENARIO v1.0
	<p>Simulate with MATLAB, Simulink, and CARLA</p> <ul style="list-style-type: none"> • Author actor behaviors in MATLAB • Author actor behaviors in Simulink • Author actor behaviors in CARLA



- Advances in ADAS and AV technologies have driven the need to develop scenario-based methods versus the traditional methods.
- Fundamental core capabilities, including requirements management, scenario creation, vehicle dynamics modeling, and continuous integration and validation, etc., are needed to fill in the gap to address hardware-based development inefficiency
- Entire toolchain needs to be fully digitized
- Cloud-based computing platform is the future to go

Q/A