



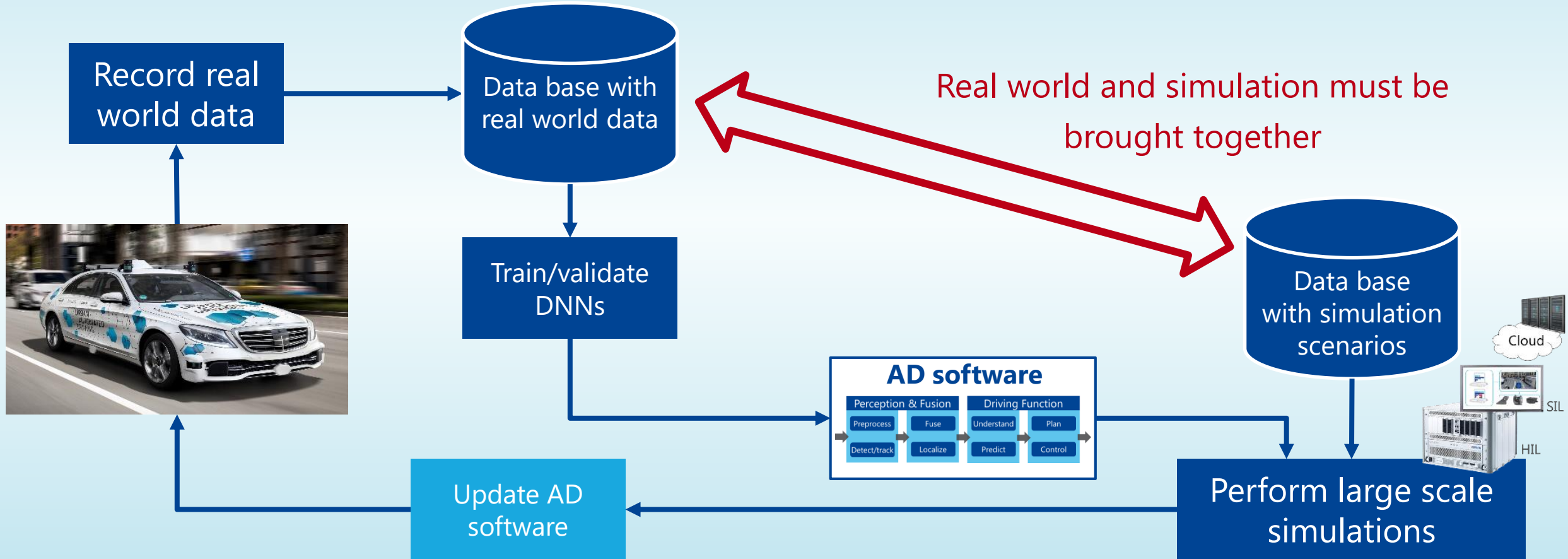
# Data Driven Development for Autonomous Vehicles

Tomáš Fridrich; [fridrich@humusoft.cz](mailto:fridrich@humusoft.cz)

[www.humusoft.cz](http://www.humusoft.cz), [www.dspace.com](http://www.dspace.com), [www.understand.ai](http://www.understand.ai)

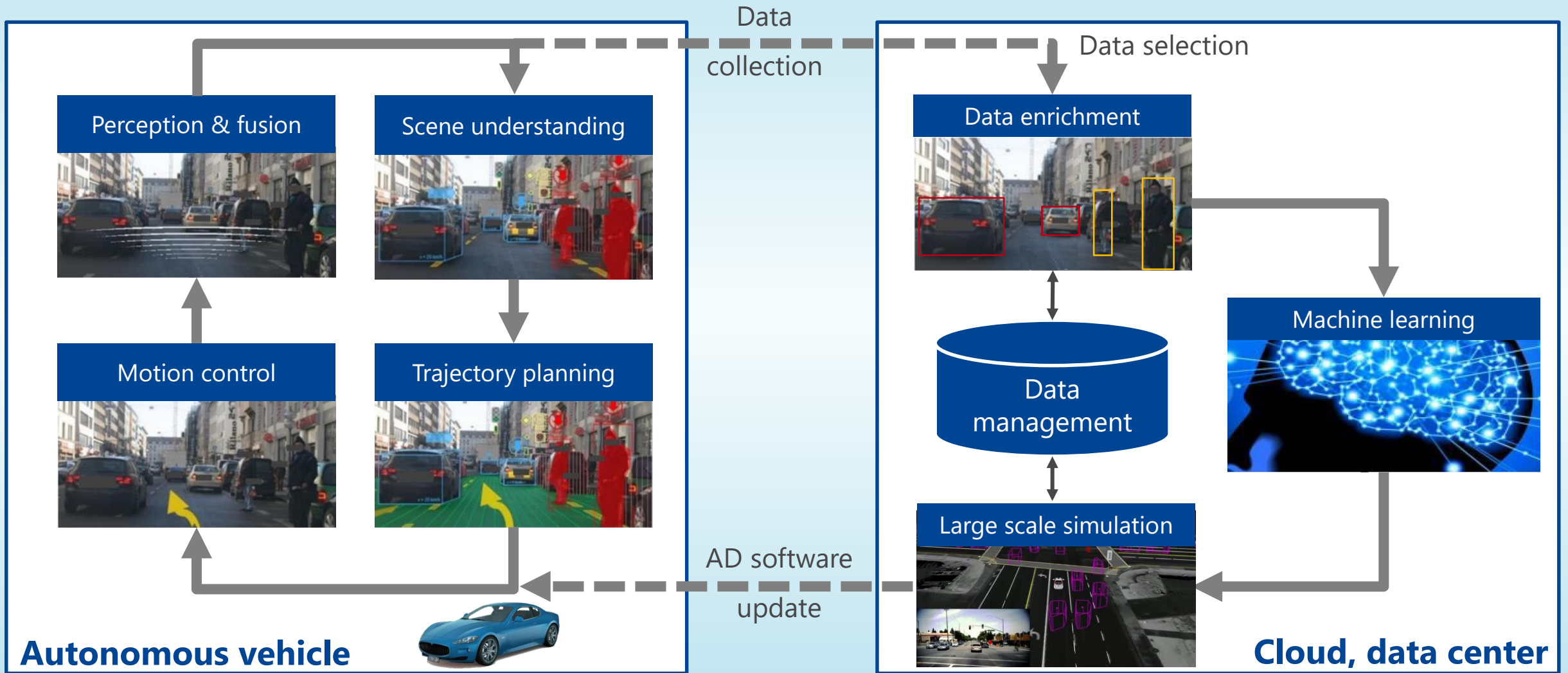
# Autonomous Driving – typical approach

## Data driven development

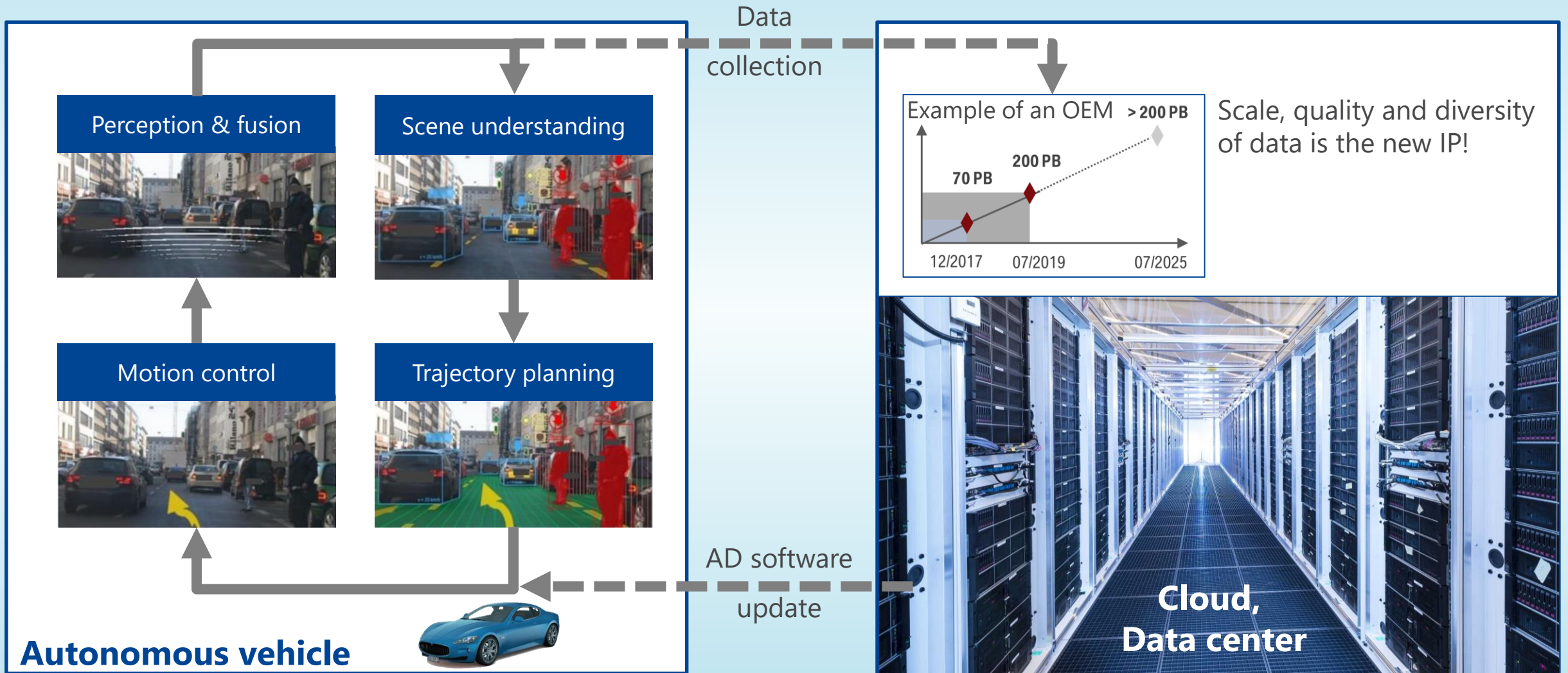




# Data driven development




# Data driven development



## Managing so much data is extremely expensive

- Real driving tests are costly (equipment, people, time ...)

AUTONOMOUS VEHICLE SENSORS		
Sensor type	Quantity	Data generated per sensor
Radar	4-6	0.1-15 Mbit/s
LIDAR	1-5	20-100 Mbit/s
Camera	6-12	500-3500 Mbit/s
Ultrasonic	5-16	<0.01 Mbit/s
Vehicle motion, GNSS, IMU	-	<0.1 Mbit/s



Total bandwidth can reach up to **40 Gbit/s ( ~19TB/h)**

Source: Stephan Heinrich, Flash Memory Summer 2017 Santa Clara, CA

- 100 000 km / 40 km/h avg speed / 19 TB/h = ~ **50 PB**
- According Nvidia volume of data required to teach AI differ between **200 – 600 PB**

Source: <https://developer.nvidia.com/blog/training-self-driving-vehicles-challenge-scale/>

# Challenges with autonomous driving

## Environment sensors

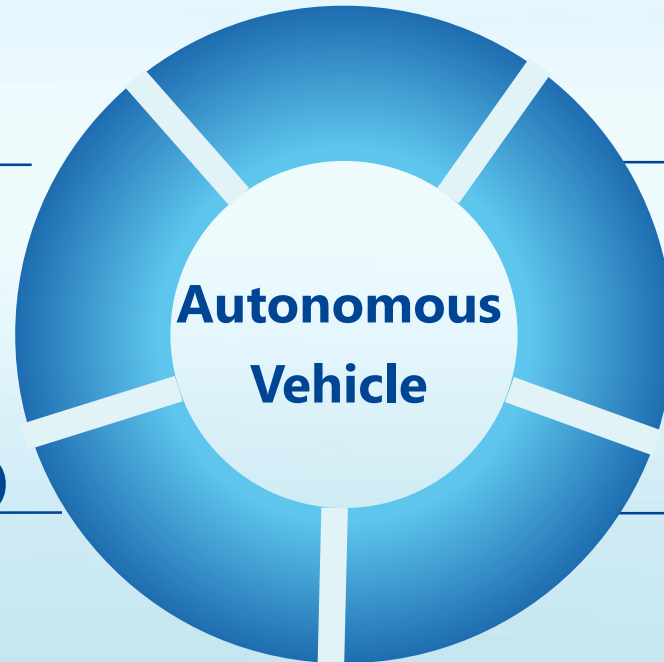
- New technologies
- 360° view, all weather conditions

## Data processing

- High performance computing
- Data management

## Artificial Intelligence (AI)

- Deep Neural Networks (DNNs)
- Data driven development



## Vehicle networks

- Increasing bandwidth
- Service-oriented communication

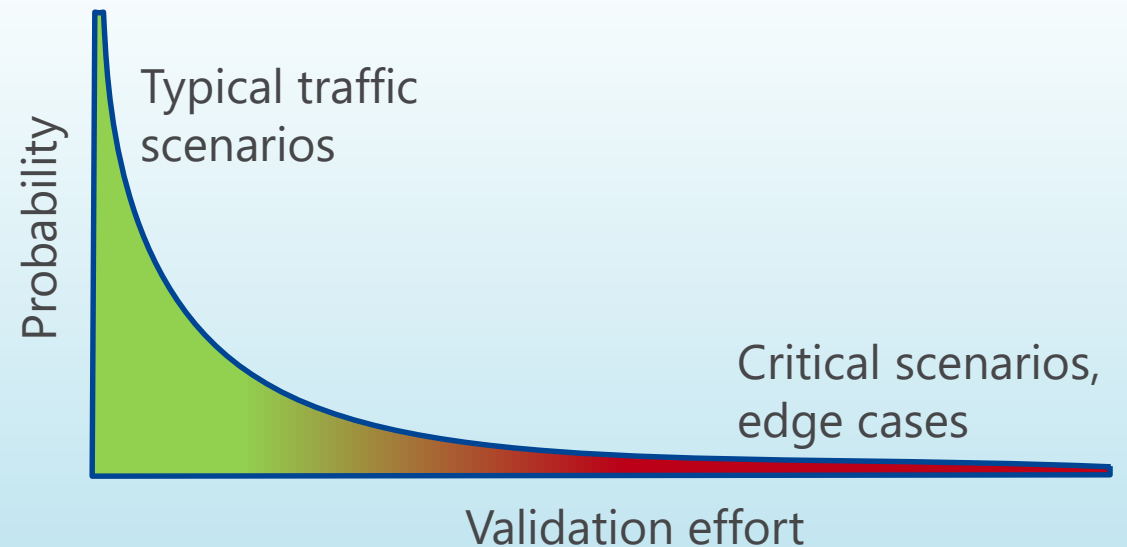
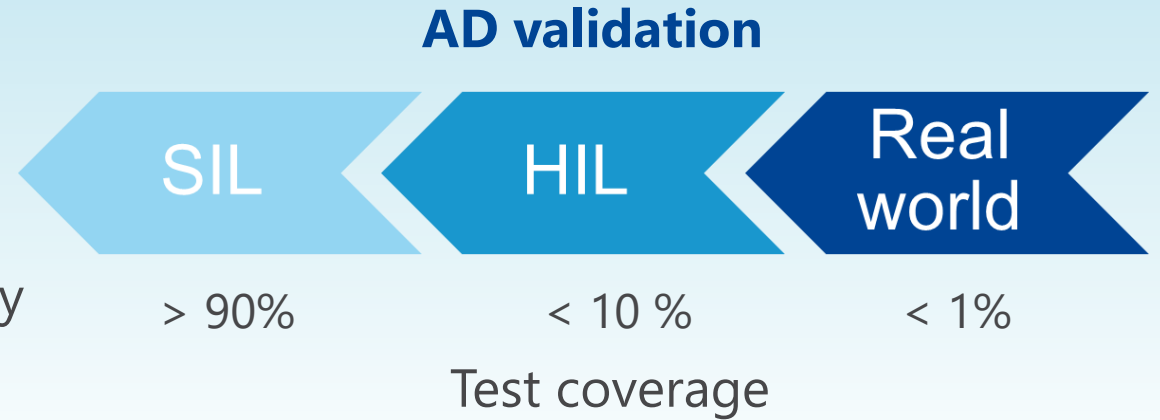
## Validation and homologation

- From real world to simulation
- New testing methodologies and operational safety



## Autonomous Validation – The problem ...

- Realism of complexity in simulation
- Creating thousands of simulation scenarios efficiently
- Critical traffic scenarios and edge cases
- Key: Effective Scenario-based Testing





# Autonomous Driving – The solution ...

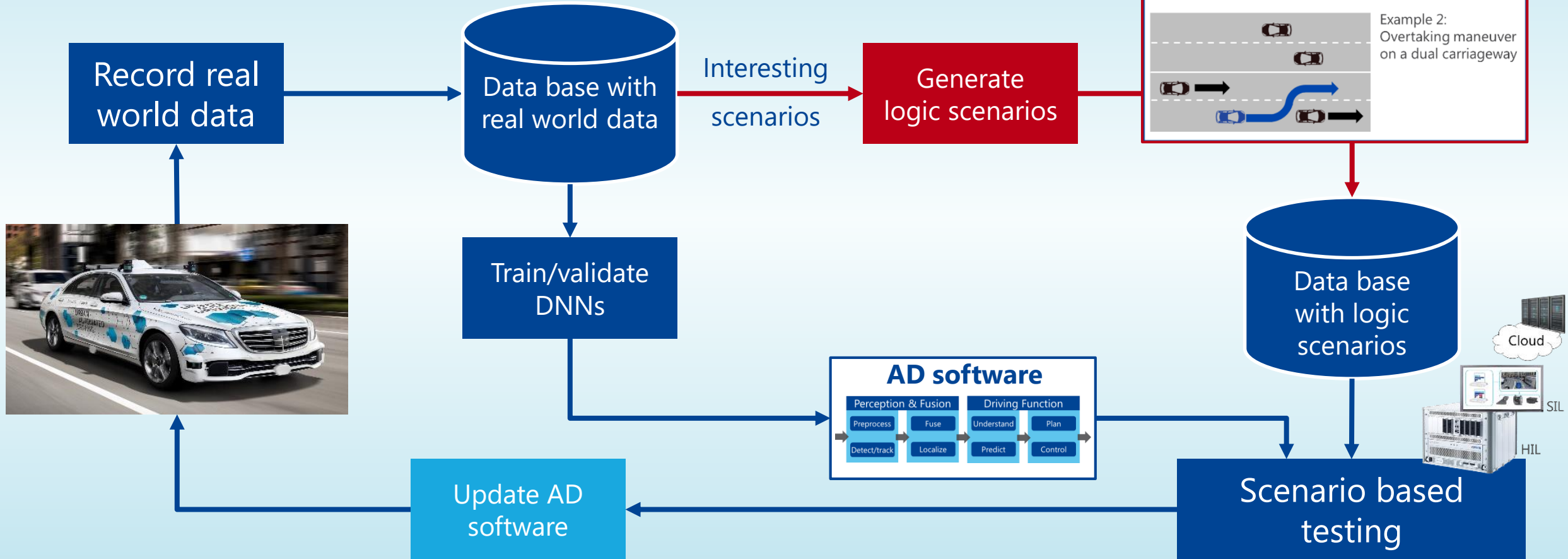
## Bringing the complexity of the real-world into AV simulation



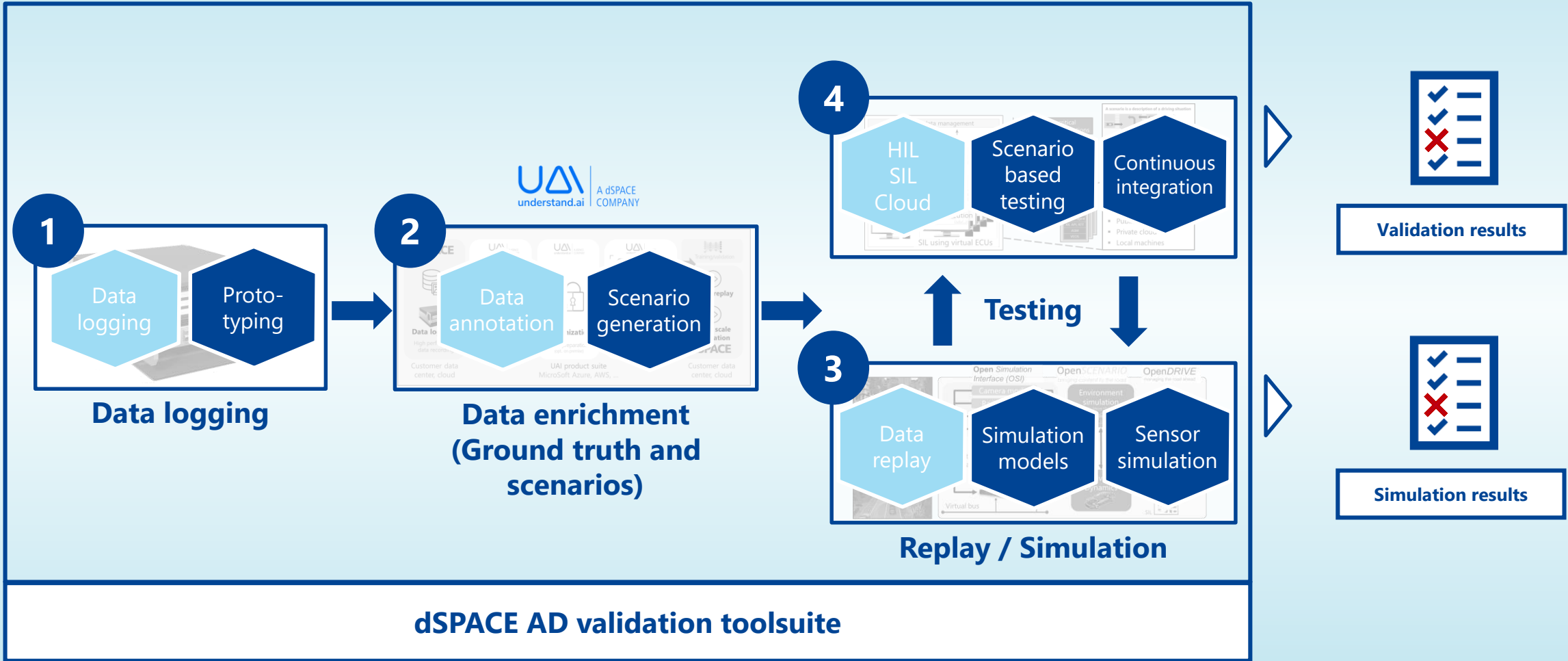


# Autonomous Driving – The solution ...

## Generate simulation scenarios from real world data



# Integrated AD validation toolsuite for data-driven development





# Data logging - AUTERA

**Flexible Configuration with 6 General Purpose Slots**  
For BUS-/Network-Card, GPU and Data Logging Extension



**Up to 32TB data Storage**  
(64 TB planned)

**> 50 Gbit/s bandwidth**



**High END GPU/FPGA support**

**Unique performance** of data logging and data replay in terms of **bandwidth** and **synchronization**

**Easy-to-scale** if you need more bandwidth or sensor interfaces

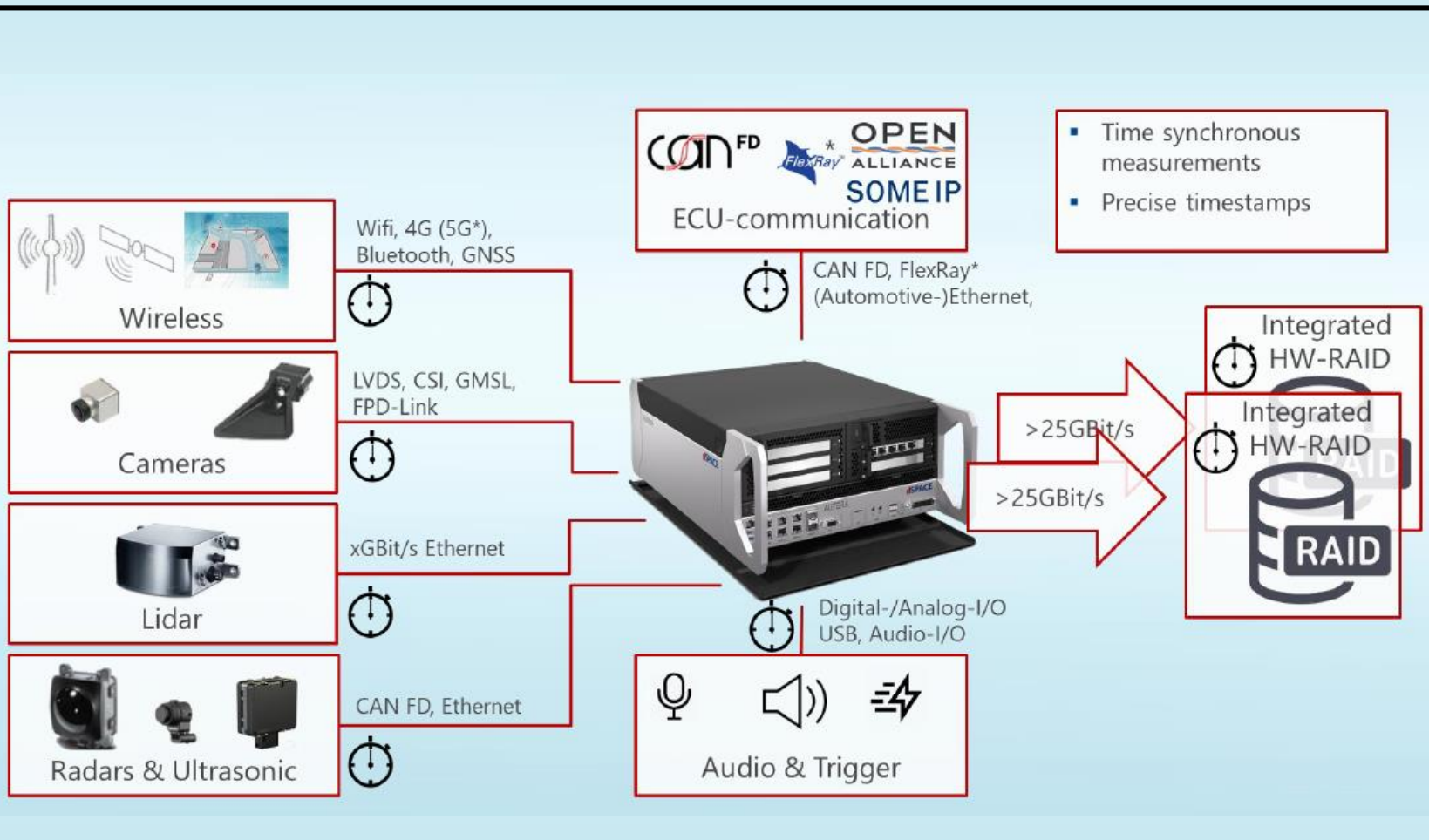
**Maximum flexibility** to adapt to different sensor interfaces, buses and Networks

**Easy-to-use** and **fast** data upload with AUTERA upload station

Prepared for **online data selection** with **AI algorithms** and **GPU power** to log "only the interesting scenarios"



# Data logging - AUTERA



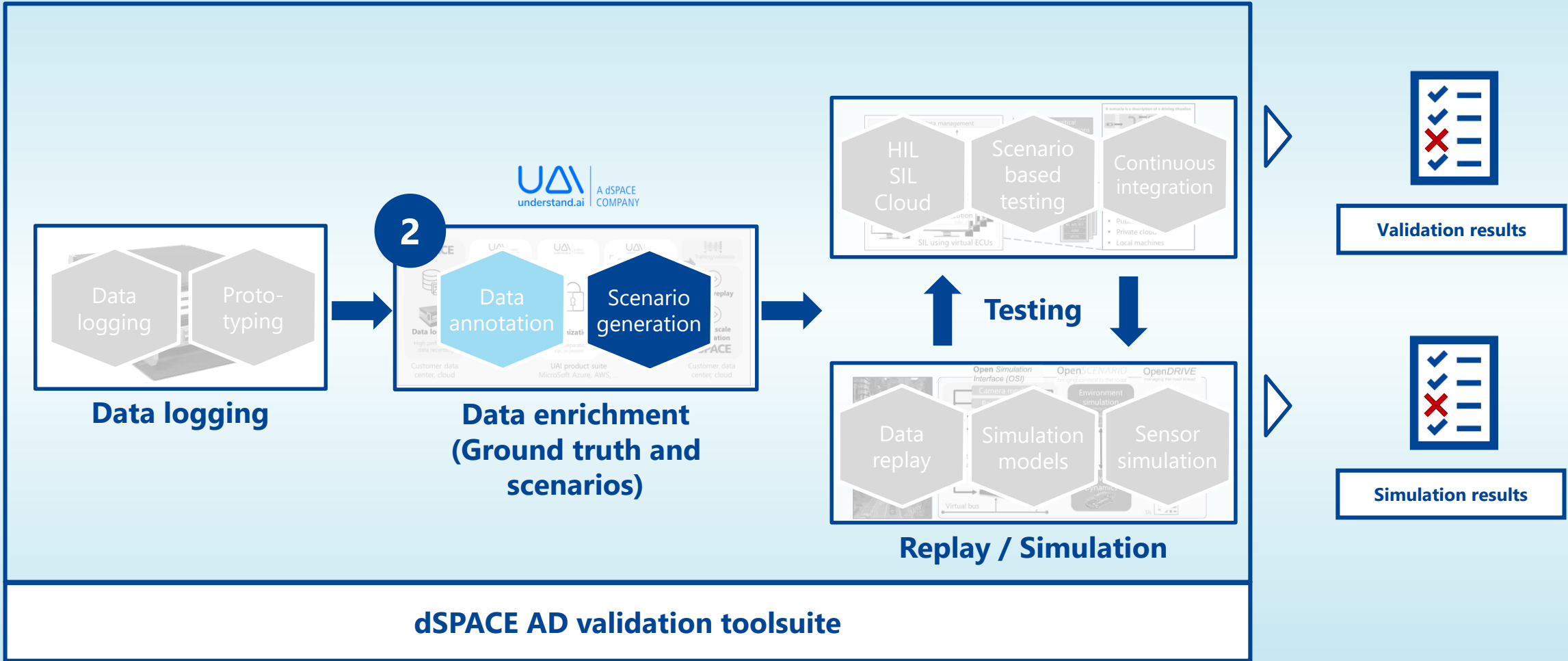
**Open Linux base System**  
**50 Gbps+ sustained data throughput**

Fast adaptation to new sensor types and  
Other communication interfaces

Precise time synchronization and time  
Stamping between all bus, network and  
Sensor interfaces

Import of communication description  
For buses to reduce **amount of logged  
Bus data**

# Integrated AD validation toolsuite for data-driven development

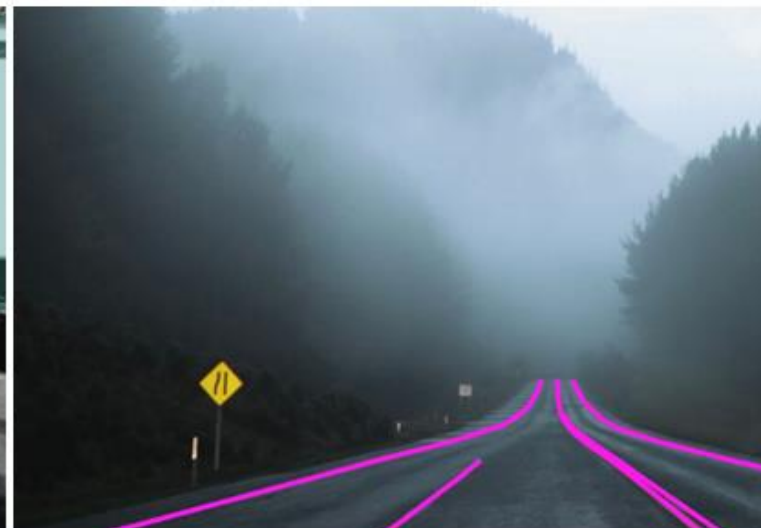




2-D Bounding Box Annotation



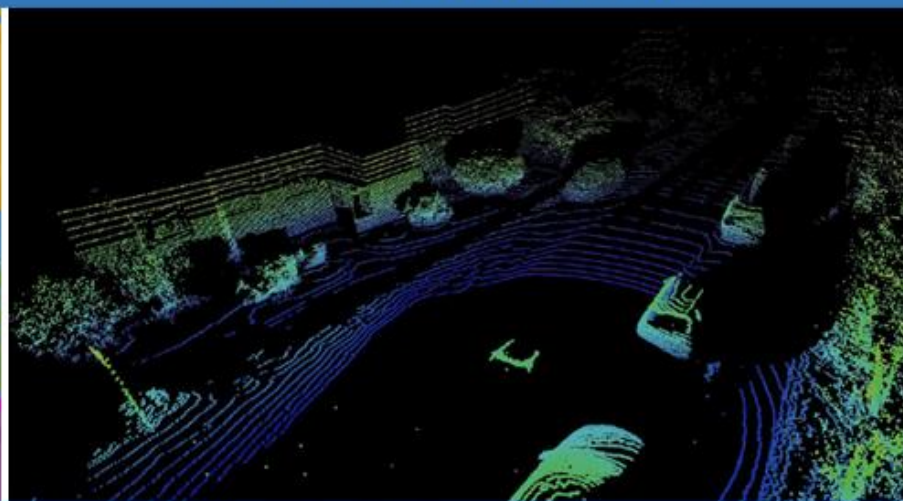
3-D Cuboid Annotation



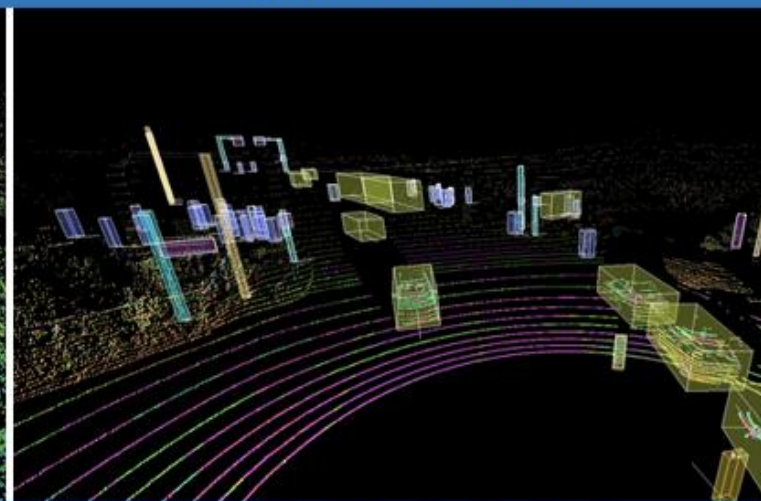
Polyline Annotation



Semantic Segmentation



3-D Lidar/Radar Segmentation



3-D Lidar/Radar Cuboids

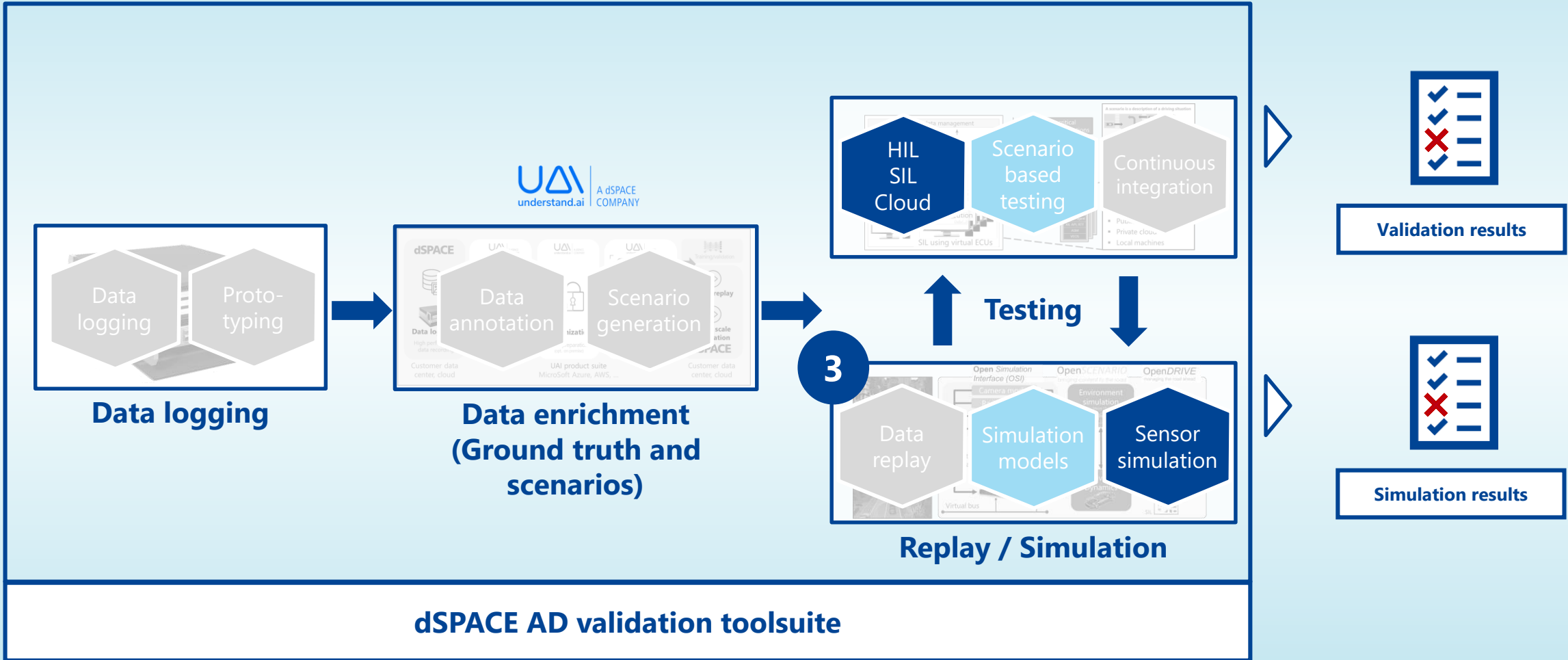


# Some Examples



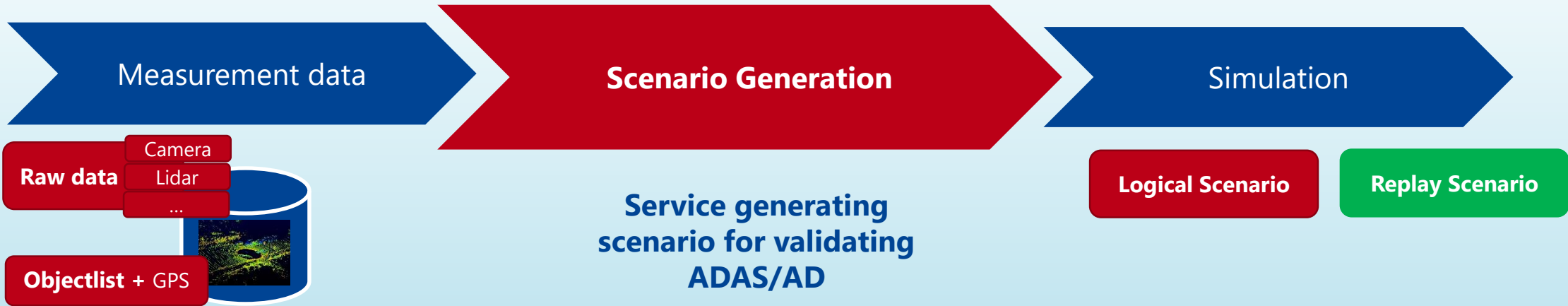
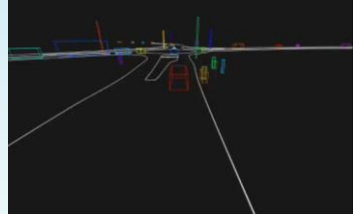


# Integrated AD validation toolsuite for data-driven development



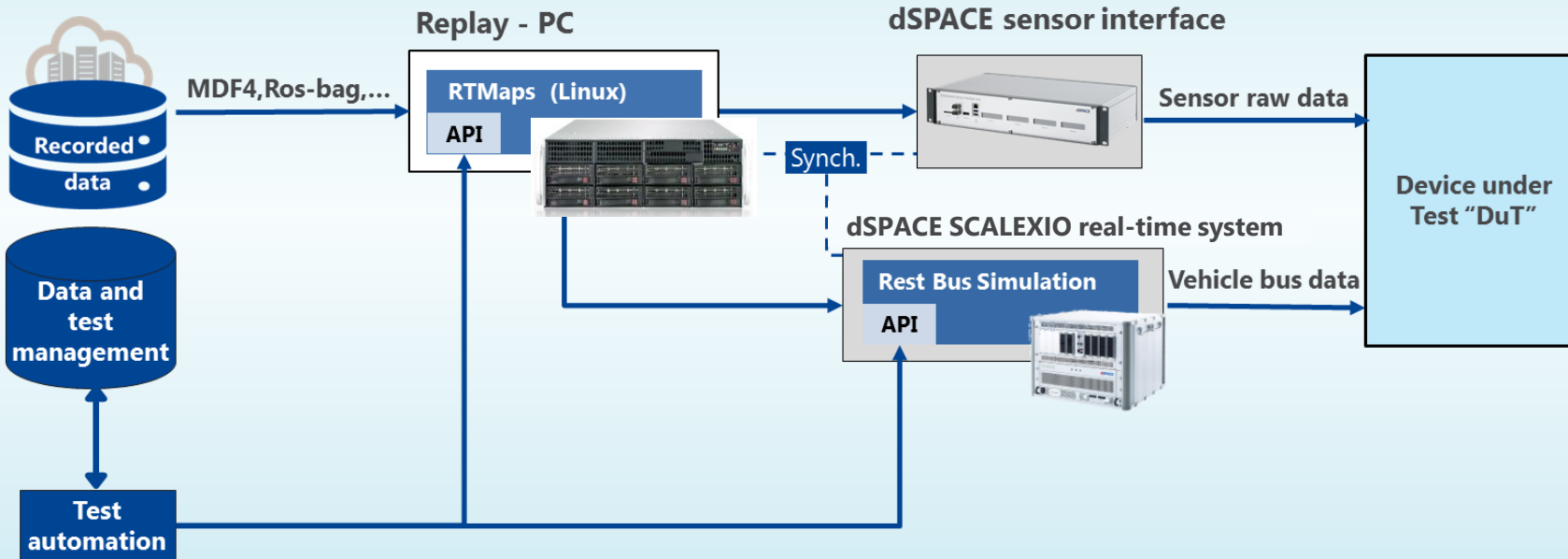
# Scenario Generation service by dSPACE and understand.ai

## Generating scenarios from real world measurements



# Data replay HW/HIL solution

## Sensor fusion and environment perception tests



## Key takeaways

**Minimal jitter** due to usage of SCALEXIO real-time system

Closed loop **environment simulation up to the initial state of the recording**

Extensive bus and sensor support with **bus monitoring and manipulation** features

Suitable for **electrical failure testing**

**Multi-role system;** a single system for data replay and closed-loop simulation.

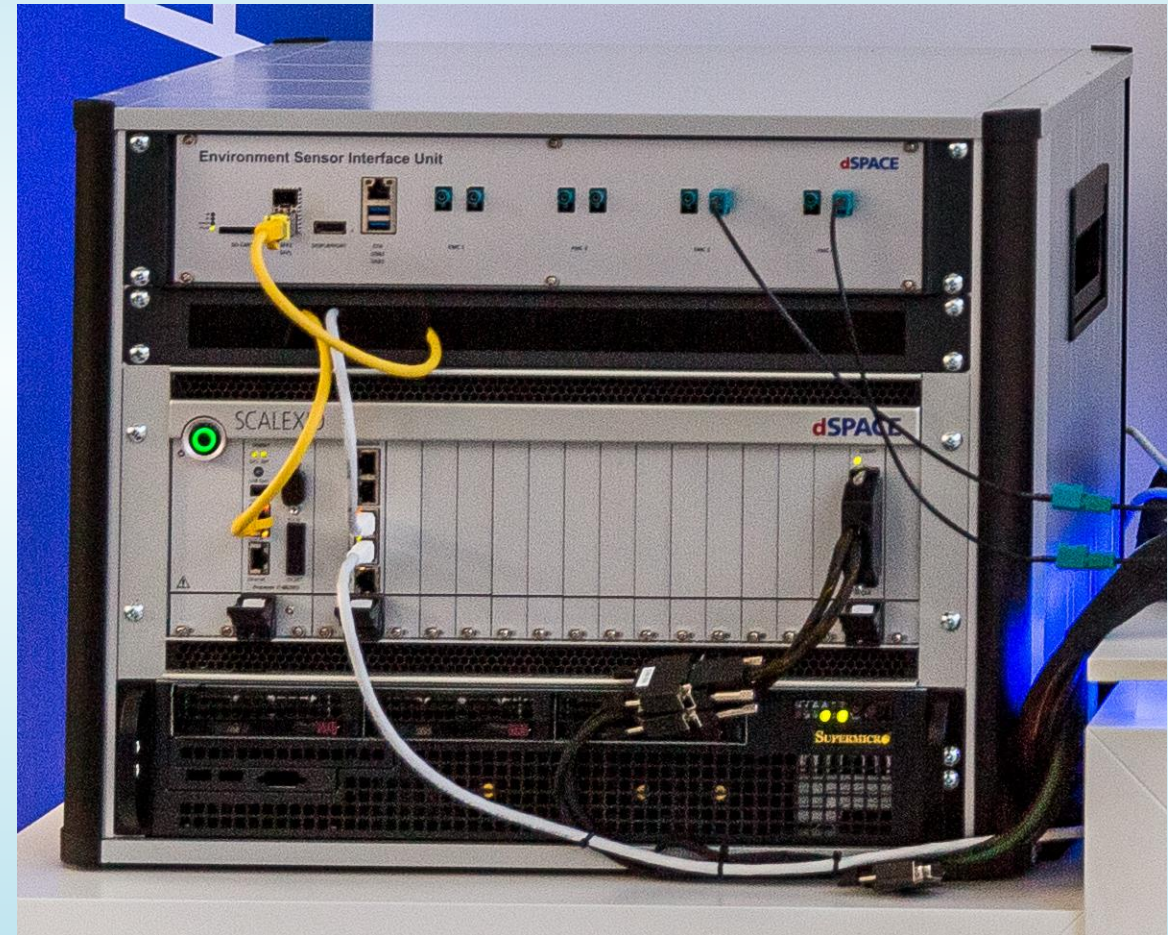


# HW data replay demo: Setup

Autonomous Driving |

## Data Replay

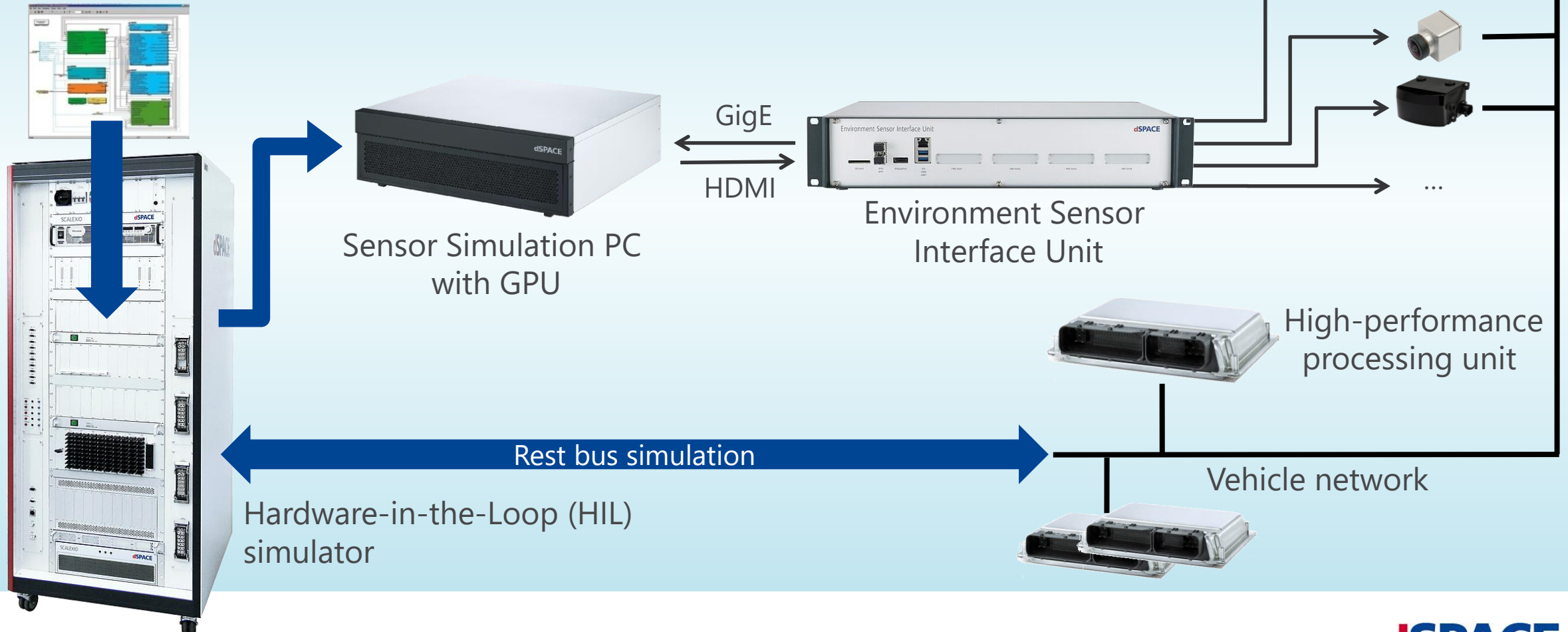
- Validation of perception and sensor fusion
- Time-synchronous replay of sensor and bus data
- Highest streaming bandwidth
- Based on unique SCALEXIO and AUTERA technology





# Use Case: Test functions for AD by means of HIL simulation

Automotive Simulation Models (ASM) for vehicle, sensor and traffic simulation





**With us, autonomous driving  
gets more drive.**