What are the key challenges around automated driving feature validation in a simulated environment, and how would you mitigate them?

**Domonkos VARGA** 

## Outline

Model based simulation overview.

(No time for model driven scenarios like PEGASUS, ...)

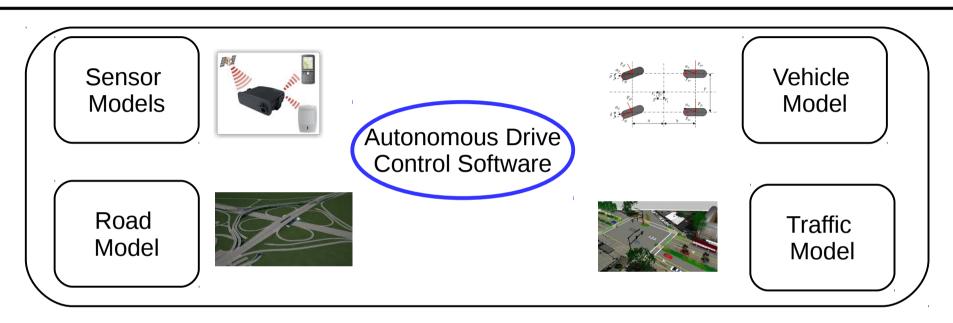
Reasons for Exposure to Accidents.

Selecting two areas:

- = Deficiencies in sensing road, traffic and environmental conditions
- = Deficiencies in Control Algorithms

**General Guidelines** 

# Virtual Driving with Model Based Simulation



### **Sensor Models:**

radar, camera, lidar, ultrasonic models should reflect sensor typical phenomena (noise, incorrect, missing information) sensor fusion, ...

#### **Road Model:**

layout including markings, intersections, traffic lights, obstruction of view, ... map for look-ahead information

### **Vehicle Model:**

behaviour in detail based on steering, acceleration, braking commands, under/oversteering Tire-road contact

### **Traffic Model:**

vehicles and other moving objects behaviour of traffic participants (politeness/dominance, ...)

## Reason for Exposure to Accidents



- a) Failure of hardware components
- b) Deficiencies in sensing road, traffic and environmental conditions



- c) Deficiencies in control algorithms
- d) Behaviour dependent accidents (traffic rule violation, ...)
- e) Faulty driver and vehicle interaction (false command)



# Deficiencies in Sensing Env. Conditions

Radar, camera, lidar, ultrasonic sensors ...

Sensors in general are well tested by the manufacturer and in the field tests under various conditions (weather, lightning etc.).

However virtual simulation offers the possibility of extended tests if adequate sensor models are available which describe the phenomenological effects of sensors.

- a) Fault injection.
- b) Simulating incorrect sensing by image and signal manipulation.
- c) Simulating extreme weather (lightning) conditions.

# Fault injection (robustness testing)

### Simulating

- a) tracking errors(pedestrians, cars, animals, ...)
- b) loss of object or non-existent object
- c) partly missing, uncomplete information to the sensor

What is the effect on sensor fusion and decision making?

It can be done by image, signal manipulation and video manipulating algorithms.

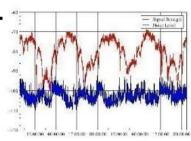
## Simulating incorrect sensing

### Simulating

- a) decrease in sensing range
- b) decrease in image and sensor signal quality
- c) quantifying results

What is the effect on sensor fusion and control algorithms?

It can be done by No-Reference Image Quality software (Neural Networks). At the same time it will also give a parameter range for the correct and incorrect behavior.



# Simulating extreme weather (lightning) conditions

### Simulating

- a) heavy rain, fog, smoke, snow, ...
- b) quick change in lightning conditions
- c) quantifying results



What is the effect on sensor fusion and control algorithms?

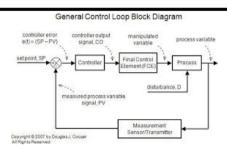
It can be done by image and video manipulating software. Quantifying by NIQA.

## Deficiencies in Control Algorithms

### Challenges

- a) challenges in stochastic systems;
  - core operation of algorithms is based on random generation of candidates
  - successful perception algorithms tend to be probabilistic
- b) challenges in machine learning systems
  - inductive learning, transfer learning
  - decision algorithms (false positive false negative trade -off)

Extremely challenging field. Algorithms, techniques under constant development. Always follow development in theory and low-risk area methods (medical systems, aerospace, ...)

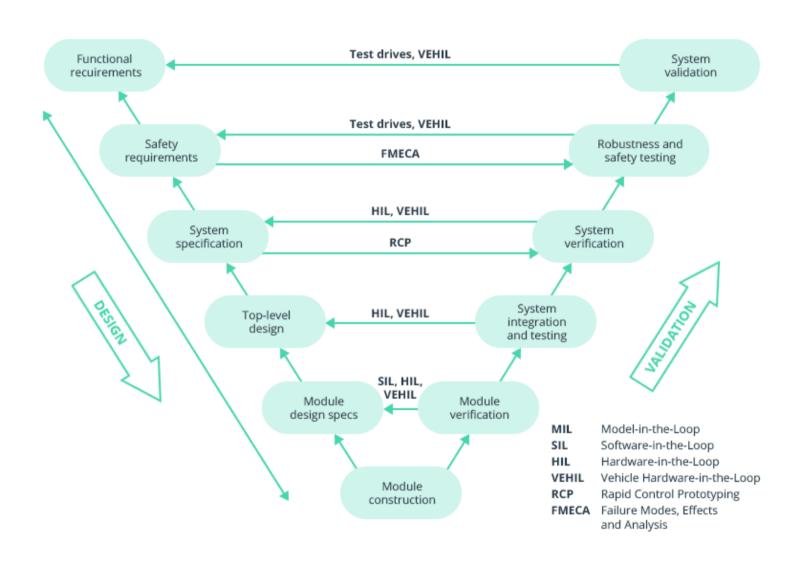


## General guidelines

- a) Know your profession and develop yourself.
- b) Know the standards, regulations, ...
- c) Have an overview about the whole project.
- d) Always communicate upstream and downstream.
- e) Follow the development in theory, sensors, concepts, ...
- f) Safety is not supposed but proven.

Background

## V model of development



## Development process in ISO 26262

#### 3. Concept phase

3-5 Item definition

3-6 Hazard analysis and risk assessment

3-7 Functional safety concept

#### 4. Product development at the system level 4-5 General topics for the product 4-9 Safety validation development at the system level 4-6 technical safety concept 4-8 Item integration and testing 4-7 System architecture design 6. Product development at the 5. Product development at the hardware level software level 5-5 General topics for the product 6-5 General topics for the product development at hardware level development at software level 5-6 Specification of hardware 6-6 Specification of software safety safety requirements requirements 5-7 Hardware design 6-7 Software architectural design 5-8 Evaluation of the hardware 6-8 Software unit design and architectural metrics implementation 5-9 Evaluation of the safety goal 6-9 Software unit verification violations due to random hardware failures 5-10 Hardware integration and 6-10 Software integration and verification verification 6-11 Testing of the embedded software

### 7. Production and operation

7-5 Planning for production, operation, service and decommissioning

7-6 Production

7-7 Operation service and decommissioning

## Scenarios in three phases

Scenarios may support the whole development process so it is mandatory to define requirements on scenarios resulting from process steps

### Scenarios in concept phase

- = hazard analysis
- = risk assessment
  - situation analysis
  - hazard identification,
     Classification

. . .

**C1** human experts formulate scenarios in natural language

C2 represented in a semiformal way

## Scenarios in the system development phase

- = functional safety concept is developed
- = criteria physically quantified
  - list of variables
  - state values

• • •

**S1** parameter ranges for the state values

**S2** formal notation for automated processing

## Scenarios for verification and validation

Test case specifications

- = unique ID
- = reference to the work product
- = preconditions/configurations
- = environmental conditions
- = input data/time sequences
- = expected behavior/acceptable variations

**T1** modelled via concrete state values, reproducibility

**T2** without any inconsistencies

**T3** represented in an efficient machine readable way

# Terminology along design/test process

Some researchers (Menzel, Bagschik, Maurer; ICE Braunschweig) find scenario representations in ISA 26262 contradictory and they suggest on three levels of abstraction

### A) Functional scenarios;

- operating scenarios on a semantic level
- linguistic scenario notation
- vocabulary for use case and domain

### **B)** Logical scenarios;

- operating scenarios on a state space level
- entities/relations represented with parameter ranges/evt. probability distributions
- relation evt. with correlations
- formal notation

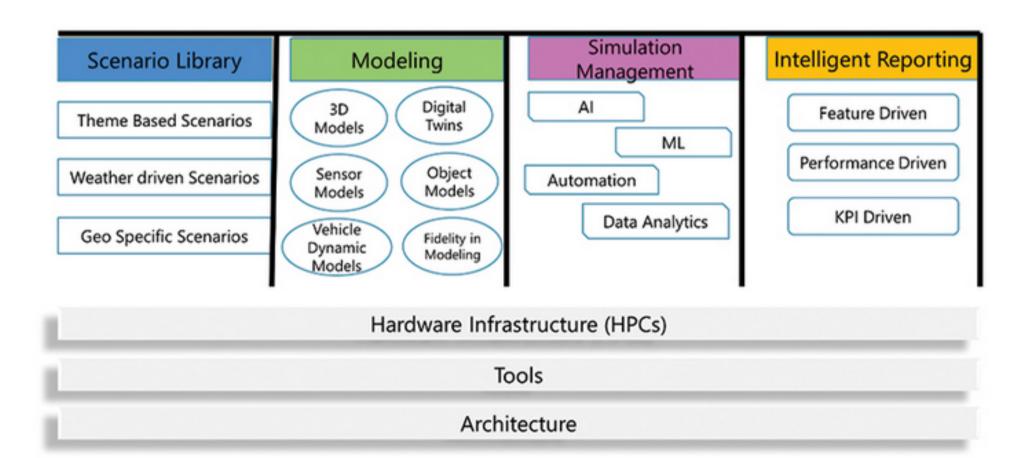
### C) Concrete scenarios;

- operating scenarios distinctively on a state space level
- entities/relations with concrete values for each parameter

### Level of abstraction

**Number of scenarios** 

# Areas in virtual environmental simulation



## Pegasus project – Key Figures

### 42 months term

January 1, 2016 - June 30, 2019

#### 17 Partners

- OEM: Audi, BMW, Daimler, Opel, Volkswagen
- Tier 1: Automotive Distance Control, Bosch, Continental Teves
- Test Lab: TÜV SÜD
- SMB: fka, iMAR, IPG, QTronic, TraceTronic, VIRES
- Scientific institutes: DLR, TU Darmstadt

### 12 Subcontracts

i.a. IFR, ika, OFFIS

### **Project Volume**

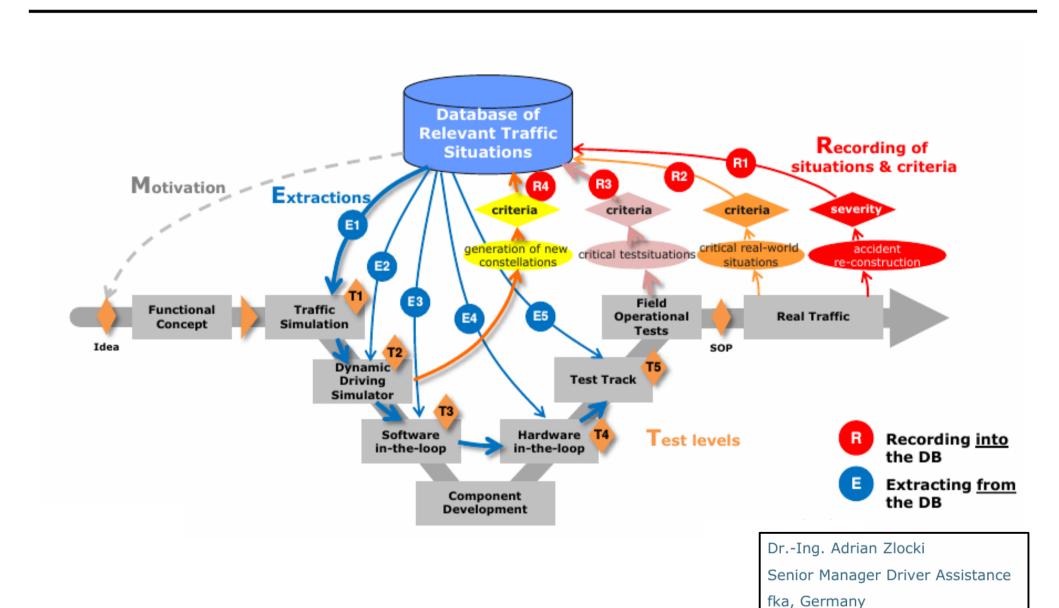
- approx. 34,5 Mio. EUR
- Subsidies: 16,3 Mio. EUR

### Personnel deployment

approx. 1.791 man-month or 149 man-years

Dr.-Ing. Adrian Zlocki Senior Manager Driver Assistance fka, Germany

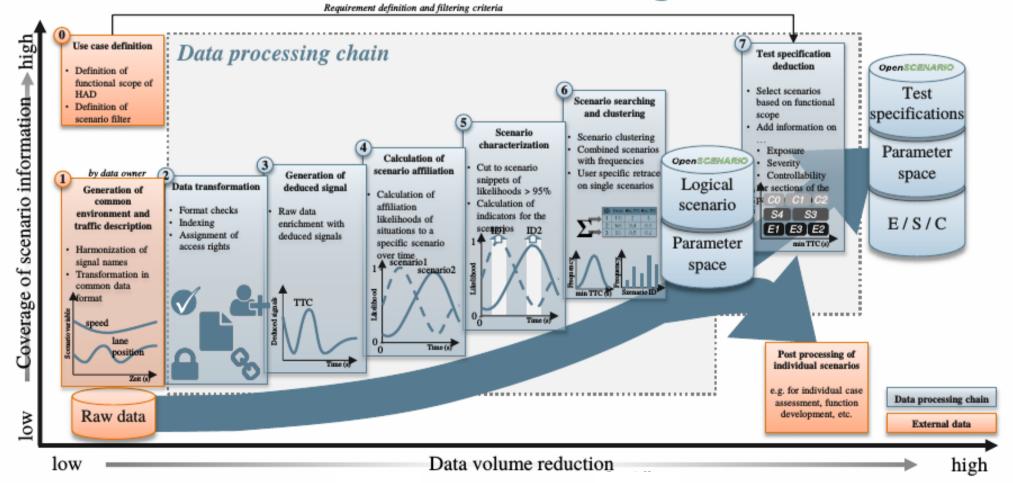
## Database Approach



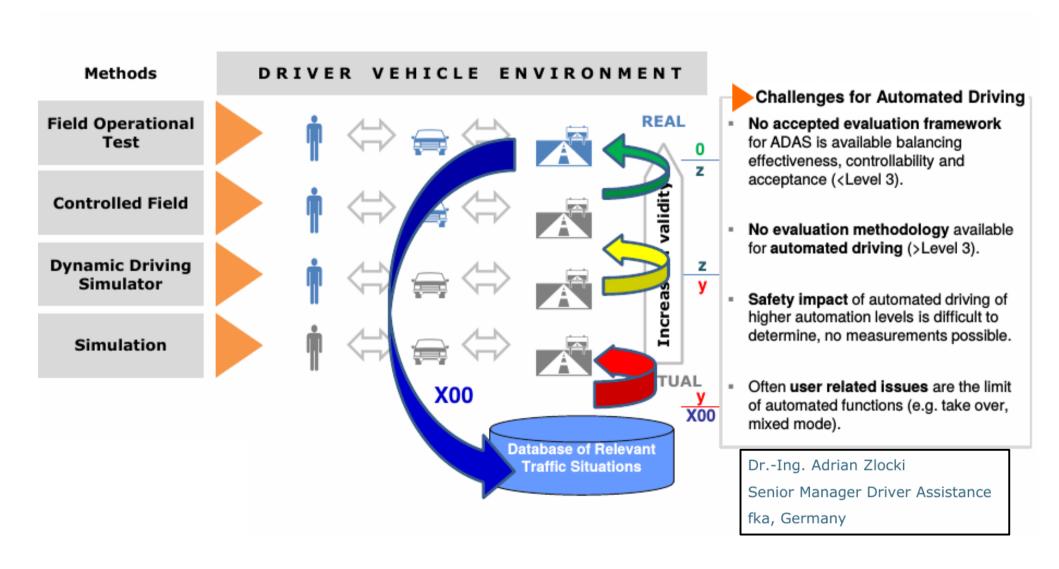
## Database Processing Chain

Dr.-Ing. Adrian Zlocki Senior Manager Driver Assistance fka, Germany

### **Database and Database Processing Chain**



## Challenges Validation CAD



## Pegasus; Research Questions

Dr.-Ing. Adrian Zlocki Senior Manager Driver Assistance fka, Germany

What level of performance is expected of an automated vehicle? How can we verify that it achieves the desired performance consistently?



### Scenario Analysis & Quality Measures



#### Implementation Process



### Testing



### Reflection of Results & Embedding

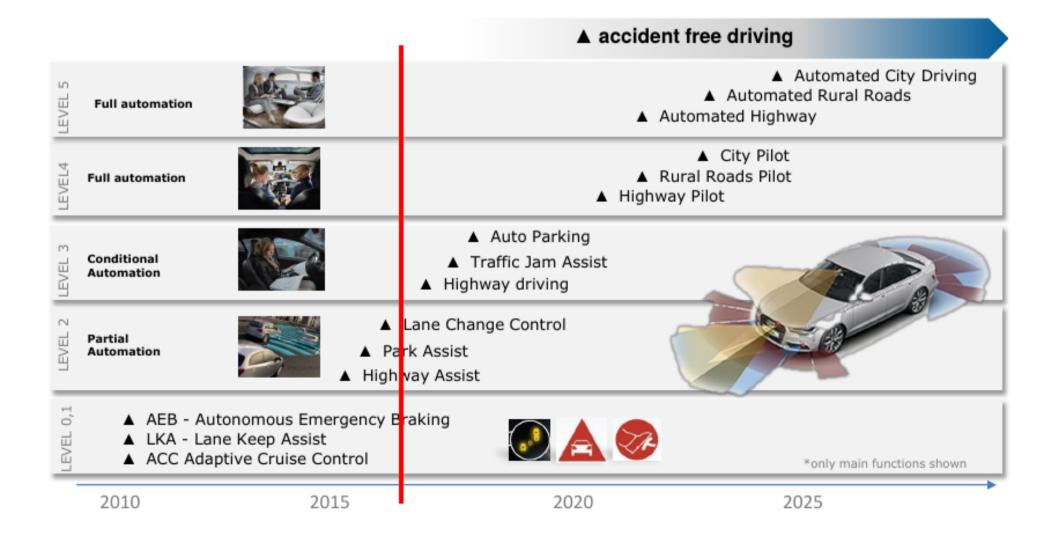
- What human capacity does the application require?
- What about technical capacity?
- Is it sufficiently accepted?
- Which criteria and measures can be deducted from it?

- Which tolls, methods and processes are necessary?
- How can completeness of relevant test runs be ensured?
- What do the criteria and measures for these test runs look like?
- What can be tested in labs or in simulation? What must be tested on test grounds, what must be tested on the road?

- Is the concept sustainable?
- How does the process of embedding work?

## Race for ADAS

Prof. Dr. Stefan Schneider Gerhard Steininger Steffen Lange



## 6 levels of Automated Driving (SAE)



Level 5 - Full Automation all-time autonomous driving at s "brain off, driver off" no driver required



Level 4 - High Automation handles anytime all situations in the defined use cases

"hands off, mind off"







Level 3 - Conditional Automa hands off, eyes off\*" limited self driving, sufficient tim in case of driver fallback

\*temporary: driver still responsible



Level 2 - Partial Automation long, AND lateral control in defin e.g. steering & braking



Level 1 - Assisted control of either long, or lat, driv steering or braking or acceleration



Level 0 - Warning / Indicatio haptic, acoustic or optical display







Assisted Driving

AVL Powertrain UK Ltd., Coventry