### **IROS 2014: Robots in Clutter Workshop**

### Automated Driving - Object Perception at 120 KPH Chris Mansley

#### **Chassis Systems Control**



## **Road safety – influence of driver assistance**



Number of road fatalities reduced by 60% within last 14 years

- $\cdot$  90% of all car accidents involving injury are caused by human error
- · Introduction of further driver assistance systems will amplify positive trend

Chassis Systems Control Source: Bosch, DAT, BASt. Based on total vehicle fleet. <sup>1</sup> Figures estimated <sup>2</sup> ACC and lane keeping support only



## **Bosch in Automated Driving**

- → First involvement in automated driving 1990s
- → DARPA Urban Challenge 2007
- → Corporate Research, Palo Alto until 2011
- Engineering in Abstatt (DE) and Palo Alto (US) since 2011







BOSCH



#### Chassis Systems Control

## **Development steps – automated driving**

	Single sensor Sensor-data fu Sensor-data fu				
500					Auto pilot
0		The seal rake		Highway pilot	Door-to-door commuting (e.g. to work) in urban traffic
			Highway assist	Highly automated longitudinal and	Strictest safety requirements
		Integrated cruise assist	Partially automatic longitudinal and lateral guidance Lane change after driver confirmation	lateral guidance with lane changing Reliable environment recognition, including in complex driving situations	No supervision by driver
	ACC/lane keeping support	Partially automated longitudinal and lateral guidance in			
	Only longitudinal or lateral control	driving lane Speed range 0-130 kph	Supervision of sur- rounding traffic (next lane, ahead, behind)	No permanent supervision by driver	

#### Series introduction

#### **Chassis Systems Control**



## Partial vs. Full automation

	Partial Automation	Full Automation
Execution /control	System	System
Monitoring	Driver	System
Driver Availability	Immediately	Not required
Failure to take over	Not acceptable	Safe state by system
System failure	Fail safe	Fail operational

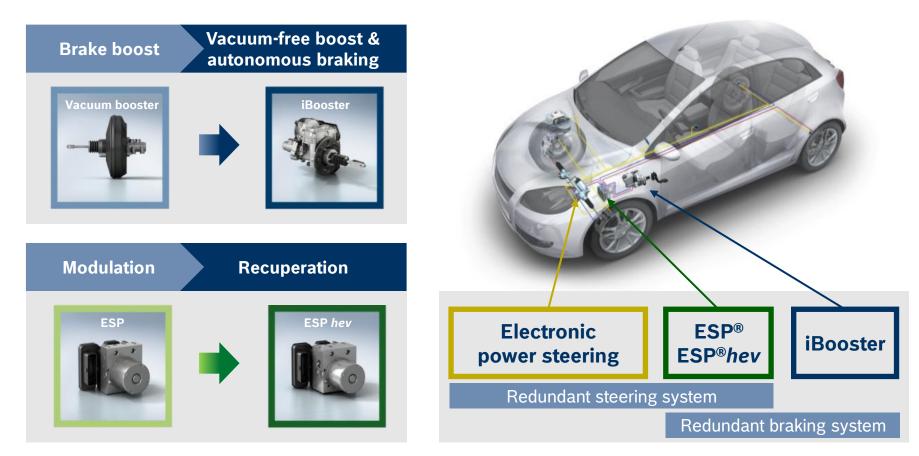
→ Electronics: Fail operational with redundant bus & power supply

- Actuators: Electronic/Electric fallback instead of mechanical fallback (driver)
- Sensing: Redundant sensing, multi-modal perception/localization
- Computing: Fail operational, automotive-grade (ECC memory, supervisor)
- Functional Safety/Release Methods: Novel system validation methods

#### Chassis Systems Control



### Hardware Redundancy – Actuation

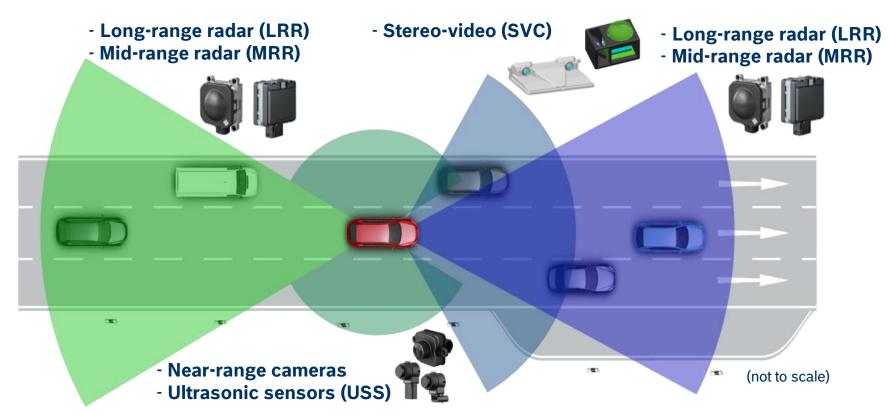


**Redundant steering, braking, and stabilization systems required** · Modular actuation concept offers a perfect solution for automated driving

#### **Chassis Systems Control**



## Hardware Redundancy – Sensing



### 360° surround sensing by combination of different sensors

- Long- and mid-range radar prerequisite for driving at higher speed
- · Satisfy reliability requirements by using multiple sensors for each area

#### Chassis Systems Control



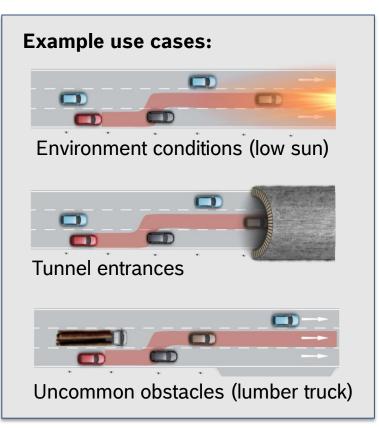


#### Chassis Systems Control



## **Requirements for Sensing**

- Automated driving use cases require
  - 360°surround view
  - 3D information
  - Shape and surface measurement
  - High reliability
  - Low sensitivity to weather and light
  - Physical redundancy



### Highly automated driving raises new challenges for sensor concept



## **Example: Perception in High-speed Traffic**

### → Challenge

- Timely response to fast approaching traffic
- → Example scenario:
  - Other German highway drivers at up to 250 km/h (70 m/s)
  - Assuming a perception cycle time of (say) 25ms
  - Assuming a need for multiple detections to achieve object presence confidence and to converge to velocity estimate
- At (say) 4 cycles with instantaneous (and in-step) decision making the object has traveled 7 meters.
  - Not accounting for object prediction and trajectory computation



## Approach

#### **Surround sensors**



30

Precise and reliable information on vehicle surroundings, e.g.

- Obstacle positions and velocity
- → Obstacle classes, (vehicle, pedestrian, ....)
- Object shape

#### Perception

Probabilistic fusion of all information into a single surround model

#### Situational Data

Additional (long-term, long-range)

e.g.

11

- → speed limits
- intersections
- road course

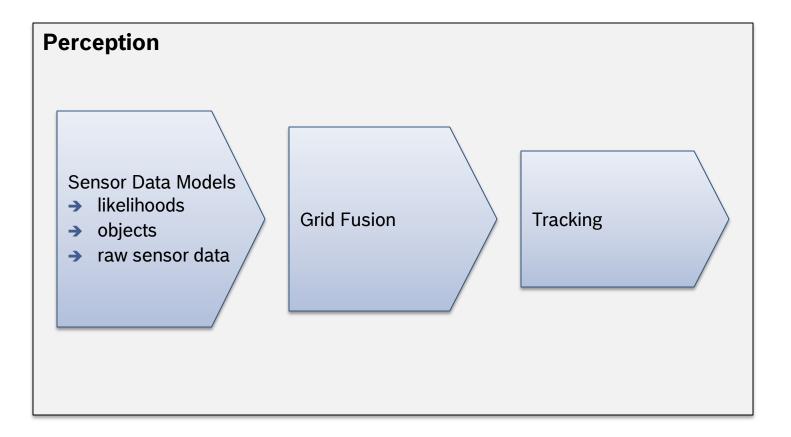
#### **Decision Making**

Context-aware, probabilistic interpretation of fused environmental model from perception and situational data



#### Chassis Systems Control

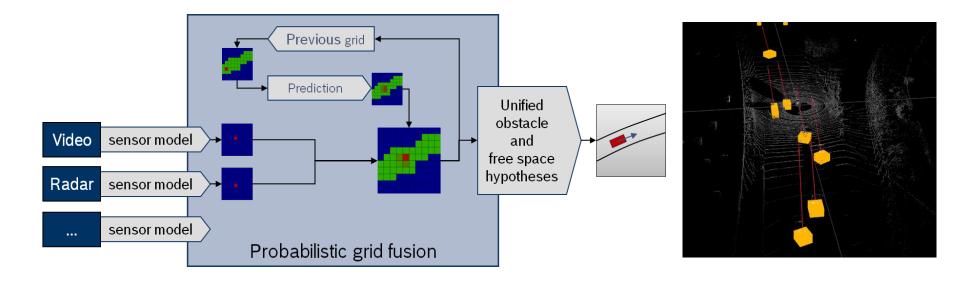
## **Perception Subsystem**





#### **Chassis Systems Control**

# **Grid Fusion**



 Grid based data fusion determines the occupancy probability of a cell by evaluating the current sensor reading and the history from past cycles

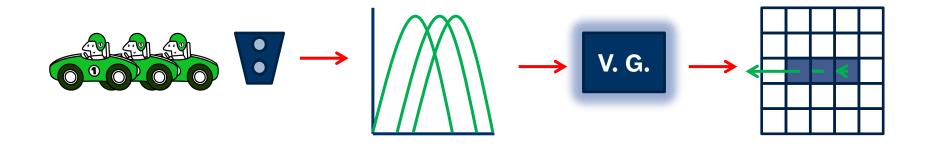
**Chassis Systems Control** 



Chris Mansley | Chassis Systems Control | 2014-09-18 | © 2014 Robert Bosch LLC and affiliates. All rights reserved.

13

### Why velocity grids?



A velocity grid representation provides a **probabilistic framework** for fusing **multiple sensors** with **different models**, while representing **uncertainty** and **avoiding data association** 



**Chassis Systems Control** 

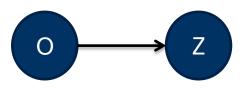
## **Occupancy Grids**

 Represent the map as a field of binary random variables corresponding to the occupancy



### p(occupancy)

0.5	1.0	0.7
0.5	1.0	0.7
0.5	0.1	0.1





- Assumptions :
  - Static map
  - Each cell is independent
  - Robot location is known

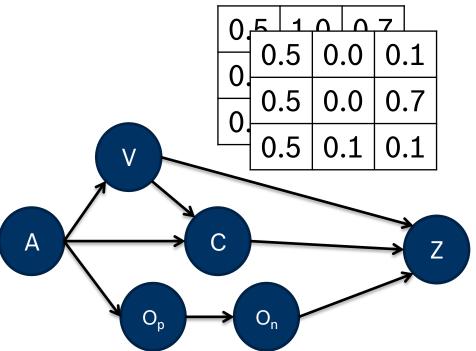
15

## **Velocity Grids**

 Represent the map as a field of binary and discrete/continuous random variables corresponding to the occupancy and the velocity



p(occupancy={0,1}, velocity=5)





- Assumptions :
  - Dynamic map
  - Cells are correlated
  - Robot location is known

#### **Chassis Systems Control**

## Software

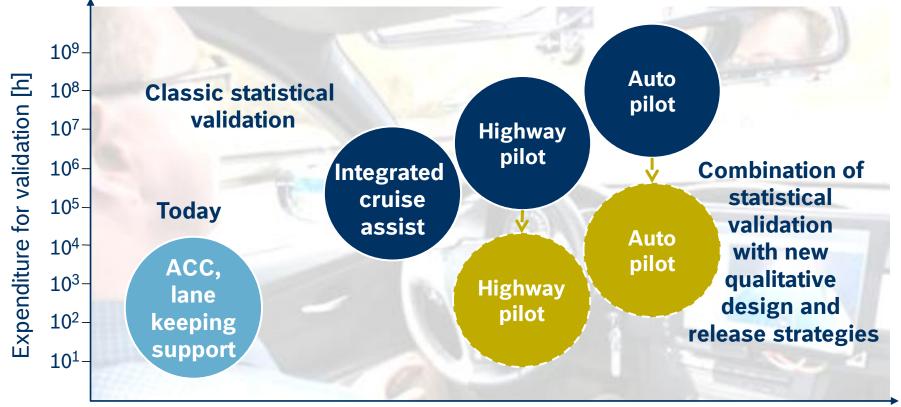
- On-going algorithm development:
  - Perception:
    - High-speed traffic situations
    - Classification to support traffic prediction (e.g. indicator cue)
    - Map inconsistency detection (localization/planning)
  - Decision making:
    - Traffic prediction
    - Safe-stop (potentially high-dynamic maneuvers)
- Validation of system behavior
- On-going system engineering:
  - Addressing scale in object number, computational demands
  - Redundancy in computation: system supervision



Chassis Systems Control

17

## Validation and release process – challenges



### Complexity of driving situations

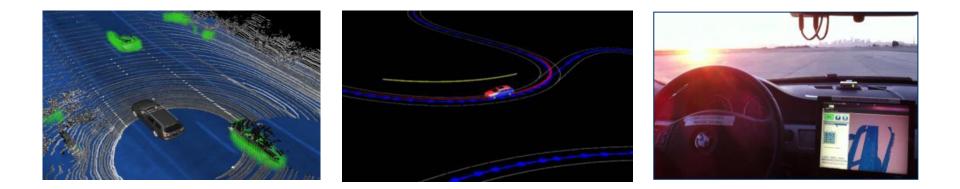
### Expenditure for validation will increase by a factor of 10<sup>6</sup> to 10<sup>7</sup>

- $\cdot$  Traditional statistical validation not suitable for higher degree of automation
- $\cdot$  Highly automated systems require completely new release strategies



## Summary

- Automated driving functions will irreversibly change vehicle architecture (hardware, software) and system validation
- Technical and legal challenges still exist and need to be solved
  - Sensors, actuators, E/E architecture and driver monitoring
  - Algorithm development
- Stepwise implementation starting with Automated Highway Driving



#### Chassis Systems Control





Chassis Systems Control

20

Chris Mansley | Chassis Systems Control | 2014-09-18 | © 2014 Robert Bosch LLC and affiliates. All rights reserved.

http://youtu.be/0D0ZN2tPihQ

