Fault-Tolerance by Graceful Degradation for Car Platoons

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Abstract

The key advantage of autonomous car platoons are their short inter-vehicle distances that increase traffic flow and reduce fuel consumption. However, this is challenging for operational and functional safety. If a failure occurs, the affected vehicles cannot suddenly stop driving but instead should continue their operation with reduced performance until a safe state can be reached or, in the case of temporal failures, full functionality can be guaranteed again. To achieve this degradation, platoon members have to be able to compensate sensor and communication failures and have to adjust their inter-vehicle distances to ensure safety. In this work, we describe a systematic design of degradation cascades for sensor and communication failures in autonomous car platoons using the example of an autonomous model car. We describe our systematic design method, the resulting degradation modes, and formulate contracts for each degradation level. We model and test our resulting degradation controller in Simulink/Stateflow.

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1 Introduction

In autonomous car platoons vehicles drive with short inter-vehicle distances to increase traffic flow and reduce fuel consumption by travelling in the slipstream. The short distances can be achieved by exploiting real-time knowledge about the driving behaviour of preceding vehicles in the platoon. This knowledge is achieved by combining onboard sensors and wireless communication with platoon members. If a sensor or communication failure occurs, the required knowledge becomes unavailable and driving within a short distance is not safe anymore. In contrast to fail-safe systems, where a shut-down of actuators leads to a safe system state, autonomous vehicles have to be fail-operational, i.e. a shut-down of the vehicle during operation on a highway is not acceptable. Thus, failures have to be compensated and adherence to safety restrictions has to be guaranteed even under failure occurrence. For autonomous car platoons, this means that the inter-vehicle distance always has to be large enough to allow for an autonomous reaction to a sudden braking of preceding vehicles



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without risking a collision. The required reaction time depends on the quality and speed of information about the behaviour of preceding vehicles, i.e. available sensors and inter-vehicle communication, and has to be reflected in the distance. One possibility to specify safe and fault-tolerant driving behaviour for autonomous platoons is to rely on graceful degradation. This means to systematically define a partial-order of less and less acceptable operation modes and to select the best achievable mode in presence of failures. Thus, the system maintains its operation as far as possible. As an example, an autonomous vehicle can be in the platoon-mode or in a mode of cooperative adaptive cruise control (CACC), where it only communicates with the vehicle directly in front of it, or in the mode of adaptive cruise control (ACC), where it relies on onboard sensors only. An operating mode in which the system is not operated at full functionality due to failures is called *degradation mode* and a sequence of less and less acceptable operation modes is called *degradation cascade*.

With the increasing complexity of vehicles, e.g. due to increasing functionality required for autonomous driving, the design of degradation cascades becomes challenging, i.e. managing the resulting amount of failure combinations. In [4], a systematic approach for design and verification of degradation cascades for embedded systems was presented. Following a systematic process can help to cope with the increasing complexity. Inspired by this work, we describe a systematic design of degradation cascades for sensor and communication failures in autonomous car platoons using the example of the autonomous model car "Velox" which serves as a case study in the AMASS research project¹. Note that although this paper focuses on safety, the proposed solutions can also be used to cope with security, i.e. attacks on sensors, actuators and communication channels, as long as these attacks are identified by some anomaly detection mechanisms (see [1] for an overview). We describe our systematic design method, the resulting degradation modes, and formulate contracts ² for each degradation level. We model and test our resulting degradation controller in Simulink/Stateflow.

Car Platoons



Figure 1 A platoon-drive.

In this paper, we focus on autonomous car platoons with at least two vehicles that drive with a small inter-vehicle distance on one lane of the highway. They synchronize their speed and sensor data based on onboard sensors and Vehicle-to-Vehicle (V2V) communication, as depicted in Figure 1. The platoon members can have different vehicle types (cars, trucks) from different manufacturers. The vehicle at the front of a platoon is the platoon leader.

¹ https://www.amass-ecsel.eu/

² Contracts are pairs of assumptions and guarantees that define the behaviour of individual system components to lower the overall complexity of large systems.

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Based on user-inputs, it determines an efficient velocity and a desired inter-vehicle distance for the whole platoon. As the safety of inter-vehicle distances depends on individual vehicle characteristics (i.e. maximum braking deceleration), we assume that each platoon member adjusts its distance control setpoint such that it is always larger or equal to the individual safe inter-vehicle distance, and never smaller then the desired distance proposed by the platoon leader. Furthermore, the leader keeps a safe distance to vehicles or platoons in front of it. Each following vehicle is a follower (or platoon member) and autonomously has to maintain the inter-vehicle distance determined by the platoon leader. This is achieved by longitudinal control, which regulates the speed of the vehicle. The vehicles drive fully autonomously with a driver who is not prepared to take control, i.e. as if no driver were present.

Outline

This paper is structured as follows: In Section 2, we discuss related work on degradation concepts for car platoons. In Section 3, we systematically analyze the system architecture, identify relevant failures for platooning and discuss how to adapt the inter-vehicle distance to capture slower response times due to less precise information. The results are used to infer degradation modes for sensor and communication failures. Based on these reactions, we propose a compact degradation controller that we model in Simulink/Stateflow in Section 4. To ensure the safety of autonomous platoons that use graceful degradation, we define contracts and discuss how they can be analyzed and tested with our Stateflow model in Section 5. We conclude the paper in Section 6 and outline future work.

2 Related Work

In this section, we review related work on fault-tolerant designs and degradation strategies for CACC and platooning.

The work in [7] proposes a diagnostic system that monitors the sensors of the longitudinal and lateral controllers in autonomous vehicles that operate in a platoon. However, it does not detect communication failures and the authors do not define a reaction to the detected failures. In our work, we assume that sensor and communication failures are successfully detected and focus on appropriate and safe reactions to detected faults.

The work in [6] presents a graceful degradation technique for CACC in case of communication failures. The main idea is to estimate the acceleration of the preceding vehicle based on distance measurement information provided by onboard sensors. This strategy shows better performance than using ACC as a fallback option. This paper only considers one possible failure of CACC-mode which is the communication with the preceding vehicle and does not handle other failures i.e. distance measurement sensor failures that affect the estimation. In our work, we cover all possible sensor and communication failures affecting the longitudinal guidance in platoon-mode. Moreover, we define reactions and design a global state-machine-model that guides the vehicle completely-autonomously in a running platoon-drive. In our approach, we rely on a similar distance measurement as described in [6] in case of communication failures with the preceding vehicle.

Our work is similar to and based on the work presented in [9], which introduces a structured design of degradation cascades for car platoons and a contract-based design approach to ensure safety. The presented degradation cascade only switches between Platoon, CACC, ACC and manual driving. In our work, there is no possibility for a fallback to manual

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driving as we handle fully automated vehicles (SAE Level 5 3). Moreover, we introduce new degradation modes that allow the vehicle to handle more failure combinations and to deliver a better performance in the platoon.

Our work is inspired by the systematic approach to define, design, implement and verify degradation cascades for embedded systems presented in [4]. The approach proceeds systematically from the analysis of the system and its safety over defining degradation cascades and its requirements down to modelling and generating code from Simulink for real-time testing. The systematic approach is illustrated with a DC drive example. In our work, we apply a similar approach on autonomous vehicles in a platoon-drive.

3 Systematic Analysis of Possible Failures and Alternative Information Sources

In the regular industrial design process, the system design is followed by a safety analysis to check whether the system adheres to safety requirements. For safe-operational systems that rely on graceful degradation, possible failures already have to be considered during the design of degradation modes. Thus, we follow [4], and already perform a systematic safety analysis before the system design. With this minor change of the usual design flow, the systematic design of degradation cascades can be easily integrated into industrial practice.

Our systematic design approach for degradation cascades consists of a systematic analysis of the system architecture to identify a) failure sources that are relevant for platooning, and b) fallback alternatives for faulty system components. To capture the performance loss of fallback alternatives, we define individual failure-specific constants that we add to the reaction time of degraded vehicles. The reaction time describes how long it takes to detect and react to a sudden change in the behaviour of the preceding vehicle. It is used to define the safe inter-vehicle distance $x_{rd,i}$ between the *i*-th vehicle and the preceding vehicle:

$$x_{rd,i}(t) = x_r + t_{r,i} * v_i$$
(1)

The parameters of the equation are the remaining distance at standstill x_r , the reaction time $t_{r,i}$, and the current velocity v_i of vehicle i. This distance law assumes similar vehicle velocities and accelerations in a platoon drive.

Our failure-specific constants describe the additional time that is needed to detect sudden breaks in the presence of specific failures. They are added to the reaction time $t_{r,i}$ in equation 1. Based on our analysis results, we define degradation cascades that describe several degradation steps as a response to sequences of failures. We combine these cascades into a single and compact degradation controller, which we model in Simulink/Stateflow to enable simulation, testing and later controller synthesis.

In this section, we first describe relevant parts of the system architecture of the "Velox" car in Section 3.1. To identify degradation modes for sensor and communication failures, we identify possible sources for required information about the environment, e.g. the distance to the vehicle in front, and about other platoon members, e.g. the velocity of the vehicle in front, based on available sensors and communication partners, and evaluate the influence of alternative information sources on the reaction time of the autonomous vehicle in Section 3.2.

³ The SAE Norm [8] defines six levels of autonomy for motor vehicle automation ranging from no automation (level 0) to full automation (level 5)

3.1 System Architecture

Within the scope of research projects, experimental cars on a scale of 1:8, the "Velox Cars", were developed by "Assystem Germany GmbH". The prototypes were designed for training and research purposes as well as for the development of advanced functions of highly automated systems (HAS) with a focus on autonomous driving. Various driving assistance functions such as a lane departure warning system, the ACC/CACC/Platoon or the Traffic Sign Assistant, have been developed. For this purpose, the model cars are equipped with a valuable range of sensors. In this work, the analysis is based abstractly on the architecture of the Velox car, which is generally similar to other vehicles.

In this paper, we assume a vehicle architecture as depicted in Figure 2. Each vehicle is equipped with ultrasonic sensors and a LIDAR (*LIght Detection And Ranging*) radar to measure the distance to the vehicle in front. A sensor fusion of the ultrasonic sensor data and the LIDAR data is performed in order to detect measurement errors. In addition, the vehicles are equipped with an odometry unit to determine their own driving behaviour (acceleration, velocity, distance covered and position). A camera and an inertial measurement unit (IMU) are implemented on the vehicle. However, we assume that they are not used by the longitudinal controller for the normal Platoon/CACC function. Note that we here assume a similar architecture and equipment of all platoon members. However, the approach could also include vehicles that are not fully equipped with sensors or communication devices by handling these vehicles as vehicles with corresponding senor or communication failures.



Figure 2 A simplified vehicle architecture for platooning.

The signal flow in Figure 2 goes from the input on the left to the output on the right. The input corresponds to the sensors, and the output corresponds to the actuator control. All sensor data is processed in the corresponding Processing Unit in the Environment Perception layer. This layer contains function blocks such as the Wheel-Encoder Processing Unit, which acquires the odometer data (steering angle and wheel encoder data) and preprocesses the odometer data. The IMU is only used if the wheel encoder fails. In the subsequent Environment Modelling layer, the environment is modelled with the help of different algorithms. This layer contains function blocks such as a Vehicle Detection block. The Platoon/CACC Controller decides between platoon and CACC mode and calculates a target velocity to maintain the desired distance between the ego-vehicle and the vehicle in front. These decisions are based on the partner's and the ego-vehicle data. The partner vehicle data are received by the External Communication interface for the communication between the own vehicle and external systems (Vehicle-to-Vehicle (V2V)

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communication, GPS etc.). The received V2V data is then filtered by **Partner Vehicle Data Processing**. Furthermore, the Platoon/CACC Controller broadcasts the Ego vehicle data. The **Velocity Controller** regulates the speed of the vehicle and controls the motor based on the provided target velocity. We design our degradation concept for the Velox Car. In practice, it can be assumed that vehicles of different manufacturers participate in a platoon. Thus, the platoon can be regarded as a heterogeneous system of systems of different manufacturers. In order to realize the functionality of platoon driving, all vehicles have to be equipped with relative distance and speed sensors as well as V2V communication. Our results can easily be transferred to similar architectures.

3.2 Failures, Consequences, and Fallback Strategies

For the platoon operation, a Velox car needs the following capabilities: it can determine the distance to the vehicle in front, it can measure its own (ego) motion data (acceleration, speed, distance covered and position), and it can receive the motion of the vehicle in front and of the first vehicle in the platoon, i.e. the platoon leader. In normal platoon operation, the distance to the vehicle in front is determined by LIDAR and ultrasonic (US) sensor fusion, the calculation of the ego-motion is based on the wheel encoder, information about the front-vehicle motion is available via vehicle-2-front-vehicle communication, and the motion of the platoon leader is available via vehicle-2-leader communication.

Kind of Information	Default Source	1st Fallback Source	2nd Fallback Source
Distance to vehicle in front	LIDAR and Ultra- sonic sensor fusion	LIDAR only, Ultra- sonic only	GPS and Wheel- Encoder (for commu- nication packet iden- tification only)
Ego-Motion	Wheel-Encoder	Inertial- Measurement- Unit (IMU)	Motor-model for speed estimation
vehicle in front mo- tion	vehicle-2-Front vehicle (V2F)	vehicle-2-Leader (V2L)	based on distance measurement
Motion of Platoon Leader	V2L	V2F	-

Table 1	Default	and	Fallback	Information	Sources.
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In the case of sensor and communication failures, the required information has to be obtained from alternative sources. In Table 1, we summarize available information sources in the Velox car and introduce new sources for the fallback scenario. If, for example, the LIDAR fails, ultrasonic data can be used without sensor fusion. However, the obtained information is less precise. If this sensor also fails, the system can still rely on the second fallback option: a combination of GPS and wheel-encoder that is precise enough to identify communication packets from the vehicle in front, but not for ACC-mode.

In the following, we describe the identified fallback possibilities for sensor and communication failures and their influence on the reaction time to changes in the behaviour of preceding vehicles. The resulting delays are expressed in terms of failure-specific constants. These constants have to over-approximate the actual delays as precisely as possible to ensure that the distance to the vehicle in front is as small as safely possible. The actual values depend on the characteristics of the sensors, actuators and the efficiency of the algorithms (fusion of data, recognition etc.) and can be determined with simulations and real-time tests.

Failure in Distance Measurement

In case of a failure of the LIDAR (LID_F) or the US sensor (US_F), it is no longer possible to use sensor fusion to increase precision, but we can still rely on the remaining sensor. As a result, the reaction time increases due to less precise sensor data. We capture this by adding a constant failure-specific factor, e.g. tr_lid1 for LIDAR failures and tr_us1 for US failures, that captures the necessary increase of the reaction time, to the reaction time in the normal platoon operation tr_pl . Thus, we get tr_pl+tr_lid1 and tr_pl+tr_us1 , respectively. It applies $tr_lid1 > tr_us1$, since the LIDAR is more accurate than the ultrasonic sensor.

If both distance sensors fail, the system can still rely on a combination of GPS and wheel-encoder to identify communication packets from the vehicle in front. In this case, tr_lid_us is added to the reaction time. However, this is not precise enough for CACC-mode.

Failure in estimating the Ego-motion

An error in the wheel encoder (WEnc_F) affects the acquisition of the covered distance, the own acceleration and speed (Ego-Motion-Data). If a wheel encoder error occurs, the system can still obtain 3-axis acceleration data from the motion sensor (inertial measuring unit (IMU)). However, this information is less precise. Accordingly, the reaction time increases to tr_pl+tr_wenc . If the IMU fails (IMU_F), it is still possible to roughly estimate the own velocity based on electrical values by using a motor model as discussed in [4]. The reaction time has to be increased to $tr_pl+tr_wenc_imu$.

Communication Failures

In the platoon operation, each vehicle communicates with the platoon leader and the vehicle in front of it. If the communication with the vehicle in front fails (V2F_F), the vehicle in front motion can only be estimated using the slower distance measurement, which means that the reaction times, and, thus, the safety distance, have to be increased when switching to the corresponding ACC mode. However, if communication to the platoon leader is still available, the platoon leader could be requested to forward messages from the vehicle in front. To this end, an extended packet filtering algorithm has to be implemented in the *Partner Vehicle Data Processing*.

If an error in the communication with the platoon leader (V2L_F) occurs (e.g. error during a sending procedure or error with the reception), we lose any information about the leader's driving behaviour. As a consequence, we would need to switch to the CACC mode and increase the inter-vehicle distance accordingly. However, if the vehicle in front is still able to communicate with the platoon leader and the ego vehicle has a stable communication connection to the vehicle in front, this vehicle can forward messages from the platoon leader. As message forwarding introduces some communication delay, reactions to sudden changes in the behaviour of the vehicle in front / the leader will also be delayed. Thus, the reaction time increases to $tr_pl + tr_front$ and $tr_pl + tr_lead$, respectively.

Based on the results of a systematic evaluation of available fallback possibilities for relevant sensor and communication failures, we define corresponding degradation modes for each combination of evaluated failures in the next section.

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4 Degradation Controller

With our systematic analysis, we have identified fallback alternatives to compensate for sensor and communication failures within a running platoon-drive. In this section, we use the analysis results to infer degradation modes that describe less and less acceptable operation modes for platoon members. We propose a controller, modelled in Simulink/Stateflow, that safely guides the graceful degradation. Note that we assume the existence of a reliable and sufficiently fast fault detection method that we can rely on. This, of course, is not trivial, but out of the scope of this work. Our controller receives fault detection events from the fault detector and selects the best mode based on these events. The Stateflow model is used for systematic testing in the next section and can be further refined for controller code synthesis.

4.1 Degradation Cascades

In case of failure combinations of different information types, our fallback strategies from the previous section can be combined step-by-step as long as information alternatives are available. If only knowledge about the platoon leader is missing, the vehicle can still switch to CACC and rely on vehicle-2-front-vehicle communication. If this communication also fails, only onboard sensor-based ACC may be possible. However, degradation is only possible as long as any acceptable operation mode can be executed. Thus, the last degradation step leads to a final degradation mode FIN_DEG, which describes a safe exit from the platoon. At this point, the system cannot rely on important sensor information and may not be able to communicate with other vehicles. Thus, it should come to a standstill as far to the right as possible, brake and warn other road users.

4.2 Controller Model

The Stateflow model, as depicted in Figure 3, consists of three hierarchical modes. The system starts in the nominal platoon mode. Failures cause a transition to the degraded platoon mode. If failures are resolved, it returns to nominal platoon mode. If no further acceptable degradation is possible, the last step leads to the final degradation mode (FIN_DEG).



Figure 3 Main Statechart.



Figure 4 Statechart for the Degraded Platoon-Mode.

The degraded platoon mode, as depicted in Figure 4, consists of three parallel states, which in turn contain further state machines: *Degradation for the communication* (Figure 5), *Degradation for the distance measurement* (Figure 7) and *Degradation for the ego motion measurement* (Figure 8) according to the failure categories: communication failures, failures in distance measurement and failures in measurement of the ego-motion. In each parallel state, the reaction time is adjusted as described in the previous section. The overall reaction time is the sum of the normal reaction time tr_pl and all added constants. If, for example, an error occurs in the LIDAR, in the communication with the vehicle in front and in the wheel encoder, the reaction time to be added is the sum of tr_lid , tr_front and tr_wenc .



Figure 5 Degradation for Communication Failures.

The state machine for *degradation in case of communication failures* is shown in Figure 5. The initial state "wait" corresponds to states without any communication errors. This state is active if the degraded platoon-mode is activated without communication errors, but with an error in the distance measurement or in the measurement of own motion. There are three different variants of degradation for communication: the failure is due to communication with the platoon leader (V2L_F), with the vehicle in front (V2F_F), or with both. When a failure

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in the communication with the platoon leader (V2L_F) occurs, we switch to a degradation mode for communication with the leader. If the failure is resolved, the system returns to "wait" again. Failures within the communication with the vehicle in front (V2F_F) are handled analogously. If the communication with both, the leader and the preceding vehicle, is corrupted, the ACC mode is activated (ACC_m=true) and the ACC-specific constant tr_acc_offset is added to the reaction time. When this state is left, the offset is subtracted again. The same holds for a switch to the CACC mode, where tr_cacc_offset is added.

It contains a sub-state machine for corrupted communication with the platoon leader (DEG_L) as shown in Figure 6 (DEG_F) is similar and, thus, omitted here). The vehicle switches to CACC mode $(CACC_m=true)$ and tr_cacc_offset is added to the reaction time. At the same time, a request for the data of the platoon leader is sent to the preceding vehicle. When this data is received (pos_resp_F), the vehicle changes to a degraded state (DEG_L1) and the reaction time is increased by tr_lead . If the preceding vehicle looses connection to the platoon leader (F2L_F), the system returns to CACC mode. During this process, the system continuously tries to re-establish the communication with the platoon leader in order to switch back to an operating mode with a better performance.



Figure 6 Degradation for Communication Failures with the Leader.

The state machine for degradation in case of distance measurement failures is depicted in Figure 7. The LIDAR and the ultrasonic sensor are mainly used for the identification of the received communication packets or for precise distance measurement in ACC mode. Starting from a wait state (wait), the system switches to a degraded state (DEG_LID1) and relies on the ultrasonic sensor for identification of communication packets if a LIDAR error occurs (LID_F). <u>tr_lid1</u> is added to the reaction time. However, when ACC mode is active (ACC_m), it switches to a degraded state (DEG_LID2) and relies on the ultrasonic sensor for precise distance measurement. <u>tr_lid2</u> is added to the reaction time. The same applies if an error occurs in the ultrasonic sensor, i.e. <u>tr_us1</u> or <u>tr_us2</u> are added to the reaction time and only the LIDAR is used. The following applies: <u>tr_lid2</u> > <u>tr_lid1</u> and <u>tr_us2</u> > <u>tr_us1</u>. For failure-free communication, an estimate is sufficient to identify the communication packets. If the communication is faulty, an exact distance measurement is needed. Thus, the reaction times <u>tr_lid2</u> and <u>tr_us2</u> are higher.

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If the data of both sensors are faulty, the system switches to a degradation state in which it relies on the GPS and the wheel encoder to identify communication packets. Compared to the positions of platoon partners that were received via V2V communication, communication-packets of the vehicle in front and the platoon leader can then be filtered. $\underline{tr_lid_us}$ is added to the reaction time in this case. This degradation is only possible if communication is available. Otherwise, the vehicle passes to the final degradation state (FIN_DEG).



Figure 7 Degradation for Distance Measurement Failures.



Figure 8 Degradation for the Measurement of Own Motion.

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In Figure 8, we depict the state machine for degradation in case of *measurement failures* of the ego-motion. Starting from a wait state (wait), the system switches to a degraded state (DEG_WENC) and relies on the inertial measurement unit to determine its own acceleration if an error occurs in the wheel encoder (WEnc_F). tr_wenc is added to the reaction time.

If the inertial measurement unit is faulty too, we switch to a degraded state (DEG_WENC_IMU) and add *tr_wenc_imu* to the reaction time. In this mode, a motor model is introduced which estimates the motor speed from electrical values without using the physical speed sensor. The introduction of the motor model was discussed in [4]. Although the speed is not estimated very well, an estimation is better than a complete loss of the measurement of the ego-vehicle motion.

The proposed fallback concept can be further refined by changing reactions to failures or adding new actions. For example, in case of a distance measurement failure, the cameras can be used to estimate the distances. Furthermore, the logical expression that leads to the final degradation state can also be adjusted. This can be useful, for example, if it is determined during simulation or testing that a safe distance cannot be maintained for a certain combination of failures. The presented controller model contains degradation steps for all failure combinations that were considered during our systematic system analysis. To ensure that the controller is complete and that the reaction time estimate is safe, i.e. leading to a safe distance to the preceding vehicle, we systematically tested our controller, as described in the next section.

5 Assurance by Mode-Specific Contracts

To ensure a safe operation of vehicles, standards like ISO26262 [3] define concepts and procedures which need to be considered during the development of safety-critical functions. These standards explicitly recommend a formal system description for heavily safety-critical systems like our car platoon. Based on the formal system description, methods like model checking allow a partly or fully automated way of verifying and validating the system early during development. A promising approach to this is Contract-based Design[5]. By specifying pairs of assumptions and guarantees the behaviour of each system component can be defined on its own and thus lowering the overall complexity of large systems. The composition of components and their contracts can then be evaluated.

To validate our degradation controller we specify contracts in SSPL (System Specification Pattern Language)[2], which enables a formal and verifiable description of behaviour while also maintaining a readable appearance. We came up with 11 contracts which describe the degradation of the platooning function. As an example, the contract defining the minimum distance to the vehicle in front while platooning is active and no errors occur (nominal platoon-mode) looks as follows:

Assumption	all of the following conditions hold:	
	- platooning is ACTIVE	
	- com_error does not occur	
	- distance_meas_error does not occur.	
Guarantee 1	distance_to_front is always greater than d_min_pl	
Guarantee 2	Whenever break_maneuver_front occurs then in response dis-	
	tance_to_front is never less than <i>distance_at_standstill</i> starting immediately.	

As a second example, we show a contract specifying a switch to ACC-mode ($drv_mode = ACC$) when the communication to the platoon head and the preceding vehicle is lost:

Assumption	No specific assumption. The contract's guarantees shall always hold.		
Guarantee 1	Whenever V2L_F changes to <i>true</i> while all of the following conditions hold:		
	- V2F_F is true		
	- drv_mode is not <i>FIN_DEG</i>		
	then in response \mathbf{drv} _mode changes to ACC eventually.		
Guarantee 2	Whenever $V2F_F$ changes to <i>true</i> while all of the following conditions hold:		
	- $V2L_F$ is true		
	- drv_mode is not FIN_DEG		
	then in response \mathbf{drv} _mode changes to ACC eventually.		

As a first step towards a verified degradation controller, we have implemented and automated tests based on these contracts in Simulink to successfully check the state machines against our specification. To this end, we have simulated our controller in the presence of specific failure combinations and checked whether our guarantees hold. Figure 9 gives an overview of internal failures and external events that we have used for systematic testing of failure combinations. Expressing our system behaviour with semi-formal contracts in SSPL, has eased writing proper test cases for our state machines.

internal failures		US F
	US_F	
	LID_F	LID_F
WEnc_F	WEnc F	► WEnc_F
		IMU_F
V2F F		
	V2F_F	
	V2L_F	
events	L2F_F	L2F_F
F2L_F	F2L_F	► F2L_F
pos_resp_F	pos resp F	▶ pos_resp_F
	pooop	bos resp L
[pos_resp_L	

Figure 9 Simulink/Stateflow model used to verify against contract specification.

6 Conclusion & Future Work

We have described a systematic design of degradation cascades for sensor and communication failures in autonomous car platoons using the autonomous model car "Velox" as example. We have modelled our resulting degradation controller in Simulink/Stateflow. For safety assurance, we have formulated contracts for each identified degradation level and used them for systematic testing. The methodology of the present work and its systematic approach is

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inspired by [4] and has been adapted for the platooning function. In our work, new ideas for degradation and reactions to errors have been developed and presented at a conceptual level. It can serve as a basis for further improvement, development and implementation in future work. The systematic approach presented in this paper is not restricted to autonomous platoon driving but can also be applied to other problems and different systems in general.

In contrast to traditional, non-distributive systems, cooperative systems should not only deal with local failures, but also with failures of the other participants. Failures can, if possible, be transmitted via communication. However, if this is not possible due to communication failures, participants should also be able to deal with this situations and reach a functional and safe state. In future work, the degradation concept could be extended to feature additional modes allowing platoon members to autonomously determine which members are affected by malfunctions. For example, if a platoon member can only estimate its own acceleration with poor accuracy due to sensor failures, it will communicate its degradation mode to the other platoon participants. Another approach would be to define reactions beyond the consideration of individual vehicles on a platoon level. For example, if the platoon leader cannot be reached by several followers, the platoon leader could be changed, e.g. by choosing the next achievable follower as a new platoon leader. This kind of platoon management has not been systematically coped with so far and would definitely be a mandatory step for a robust and applicable platooning functionality.

As a first step, we have tested our concept based on formal contract specifications. By expressing our system behaviour with semi-formal contracts in SSPL, it has already been much easier to write proper test cases for our state machines. In future work, we aim at automatically verifying our contract specification against the static system architecture using model checking. A promising candidate is the model checking tool OCRA⁴ as it already supports this type of contract verification. We are currently developing a translation from SSPL to Othello, the contract specification language supported by OCRA. With an automatic translation, the engineers will not have to cope with difficult expressions in temporal logic but can rather use our template approach to specify and verify their systems.

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