

Testing UAVs

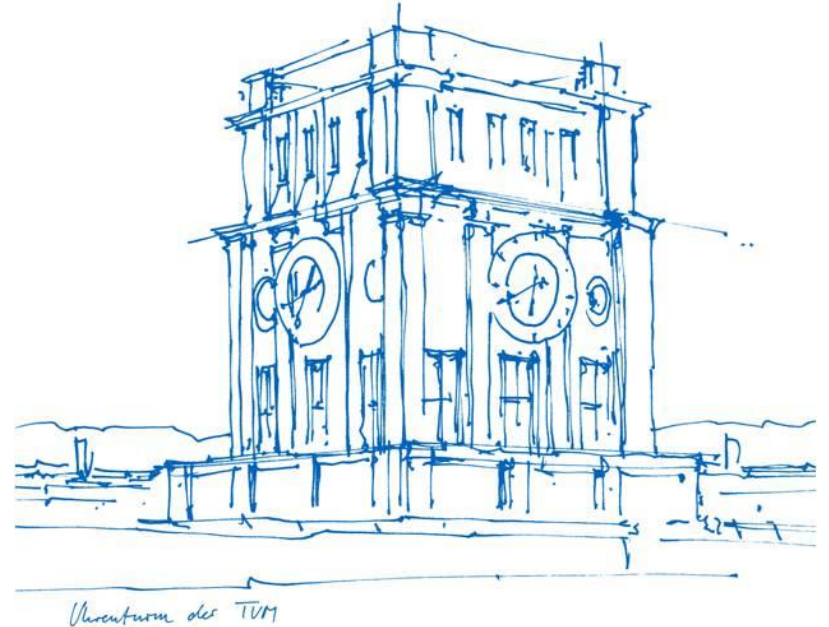
Alexander Pretschner

TUM | fortiss | bidt

jww Tabea Schmidt, Florian Hauer

**Assured CPS Autonomy for 3D Urban Transportation:
Drones, Flying Cars and Beyond**

June 9th 2021



Motivation



<https://www.youtube.com/watch?v=crHdX7ODvYo>

Background: Testing ADAS

Test case generation for automated driving systems: try to find an environment (street layout, other cars, their environment) that leads to a violation of safety distance

Cannot reuse pre-recorded drives –
but can cluster recorded drives to infer scenario types; then use these to find „extreme“ instances

Testing cars is simple: We have regulation and scenario types!

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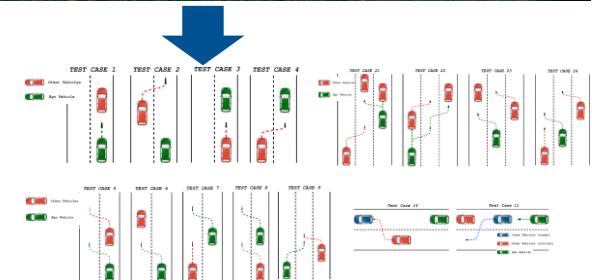


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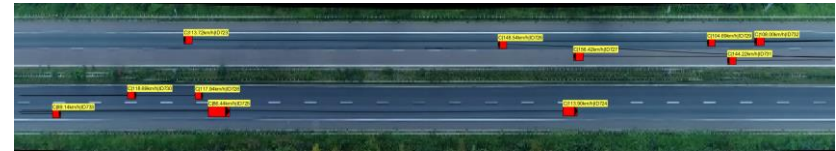


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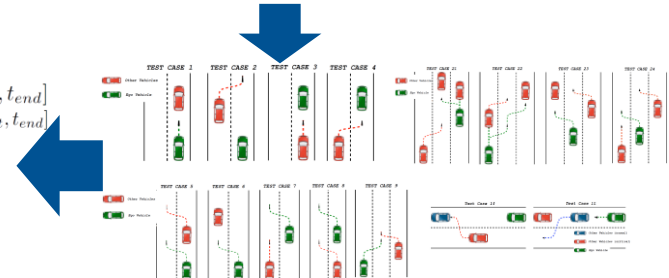
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$$\begin{aligned}
 f &= \min\{d(t) - \text{safeDist}(t)\} & t \in [t_{\text{start}}, t_{\text{end}}] \\
 f &= \min\{\text{actualValue}(t) - \text{envelopeTrsh}(t)\} & t \in [t_{\text{start}}, t_{\text{end}}]
 \end{aligned}$$



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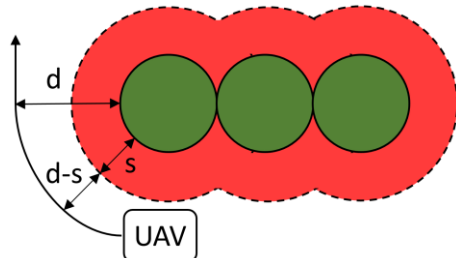
Understanding Safety of UAVs in Urban Areas – Motivation

Challenges: No systematic tests for UAVs!

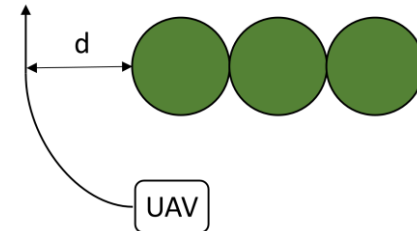
- A. Testing the behavior of the UAV in various scenarios.
- B. Ensuring that it behave safely even in the most challenging situations (worst-case situations).
- C. Explicitly defining the safe behavior of a UAV in each possible situation.
- D. “Good” tests? Those that reveal *potential* defects, with good cost effectiveness. Optimization problem.

Two cases:

- (i) A safety distance s is specified,
UAV needs to keep distance $d > s$.
Objective: minimize $d-s$



- (ii) No safety distance can be specified,
worst-case situations need to be found.
Objective: minimize d



Generating “Good” Test Cases – Boundary Analysis Testing

In addition to minimizing distance, we need to encode geometry.

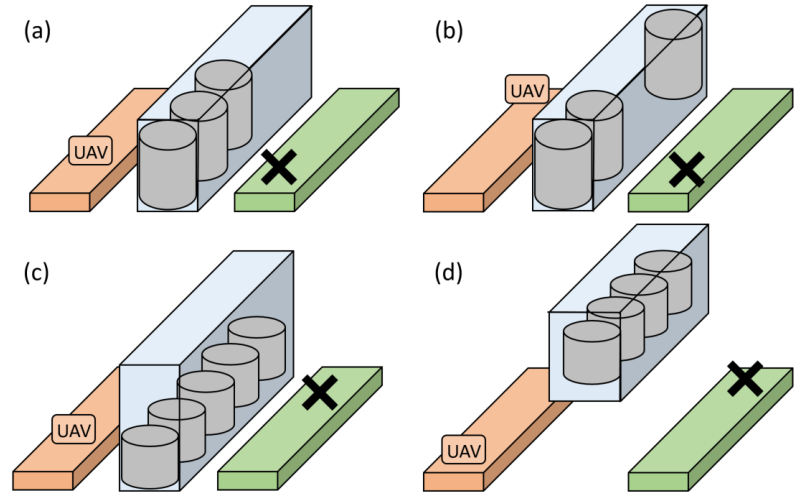
Fitness functions for Boundary Analysis Testing:

(a) fly around obstacles or (c) fly above them:

$$f = \begin{cases} \min(d(t)), & \text{if given logical scenario is displayed} \\ \infty, & \text{otherwise} \end{cases}$$

(b) fly through a gap of width w between two obstacles
or (d) fly below them:

$$f = \begin{cases} \min(w), & \text{if given logical scenario is displayed} \\ \infty, & \text{otherwise} \end{cases}$$



Experimental Results – Boundary Analysis Testing

Scenario (b)

Gap width: 3.76 meters

→ Questionable behavior



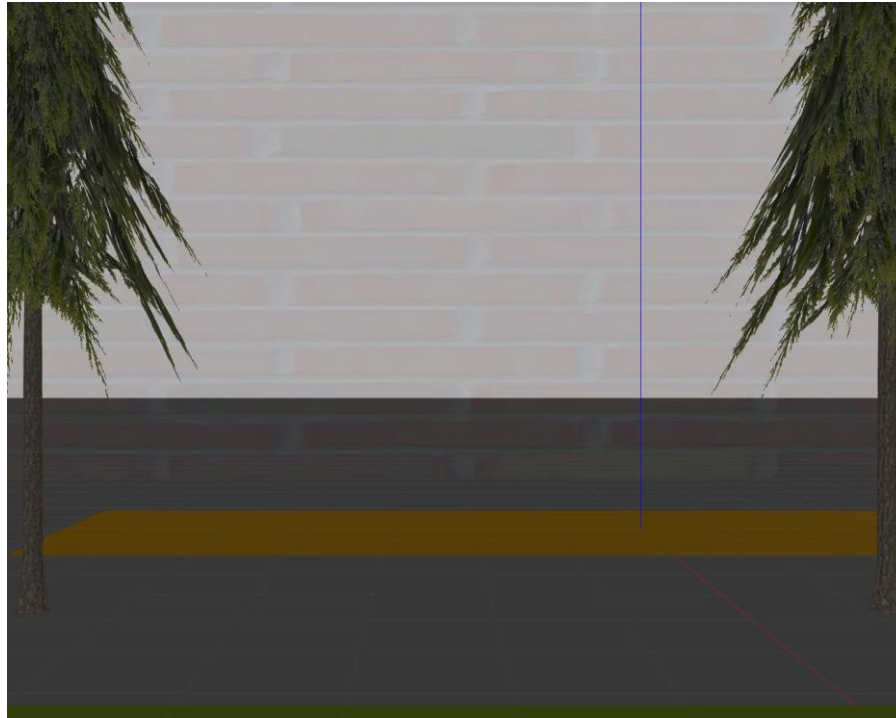
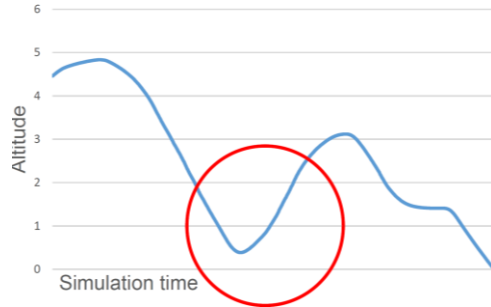
PX4 autopilot
+ obstacle avoidance

Experimental Results – Boundary Analysis Testing

Scenario (b)

Gap width: 4.77 meters

→ Safe behavior



PX4 autopilot
+ obstacle avoidance

Conclusion

Challenges for testing the safe behavior of UAVs:

Few rules! No scenario types yet! No definition of “safe” behavior!

Policy should include help, or a foundation, like RSS, on how to generate “good” test cases for testing the safe behavior of UAVs in urban environments?

→ use scenario-based testing and search-based techniques to generate challenging environments

In the **experiments**, we found several safety distance violations and questionable behaviors of the UAV.

→ shows the effectiveness and applicability of the proposed methodology

Outlook:

- More complex scenarios; co-operating drones; drone2X communication
- Estimate maximum number of obstacles necessary for testing; then shape/position/size in a second step