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# Vehicle localization by cooperative landmarks

Eigenlokalisierung über transponderbasierte Landmarken

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## Vehicle localization

- Navigation
- Advanced driver assistance systems (ADAS)
  - Lane accurate positioning
- Reference systems

## Characteristics of vehicle localization systems

- availability
  - low cost
  - accuracy
  - integrity
- Navigation: GNSS
- ADAS, reference systems: GNSS?

## Principle

- Cooperative landmarks are integrated into infrastructure
- Vehicles use RF localization to determine their relative position to the landmarks (distance and angle)
- Landmarks communicate their global positions
- Vehicles combine the information with odometry sensors to perform self-localization

## Advantages

- Independent of GNSS availability
- Higher localization accuracy in comparison to available mass-market solutions
- Suited for mass production → potential for low cost

# Vehicle localization in urban environments



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## Evaluation for intersection geometry

- Ko-FAS intersection in Aschaffenburg, Germany
- Landmarks are located at diagonal corners (~26m distance)



Localization performance depends on

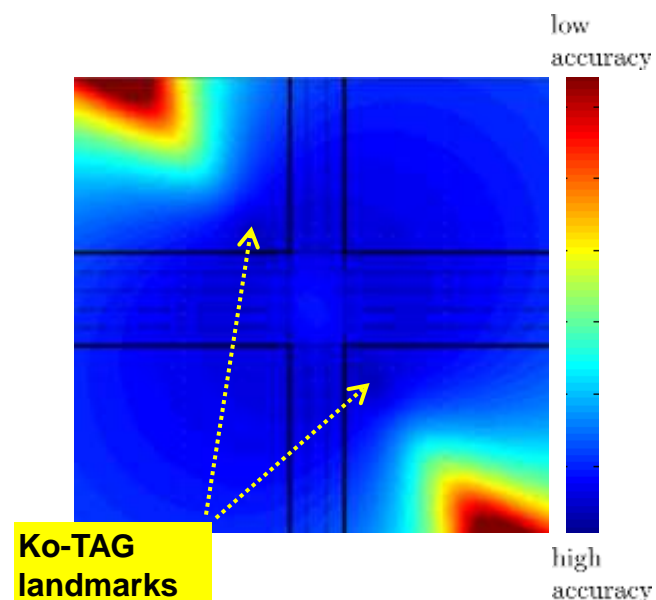
- Number of landmarks
- Geometric constellation of landmarks
- Position of the vehicle

Upper Bound on RMSE -  
Information obtained in a certain  
position

- Fisher Information Matrix

$$\mathbf{F}(\mathbf{x}) = \sum_{i \in \mathcal{H}_r} \mathbf{F}_{r_i}(\mathbf{x}) + \sum_{i \in \mathcal{H}_\phi} \mathbf{F}_{\phi_i}(\mathbf{x})$$

$$\text{RMSE}(\mathbf{x}) \leq \sqrt{[\mathbf{F}^{-1}(\mathbf{x})]_{1,1} + [\mathbf{F}^{-1}(\mathbf{x})]_{2,2}}$$





## Theoretical results for intersection geometries with two transponders

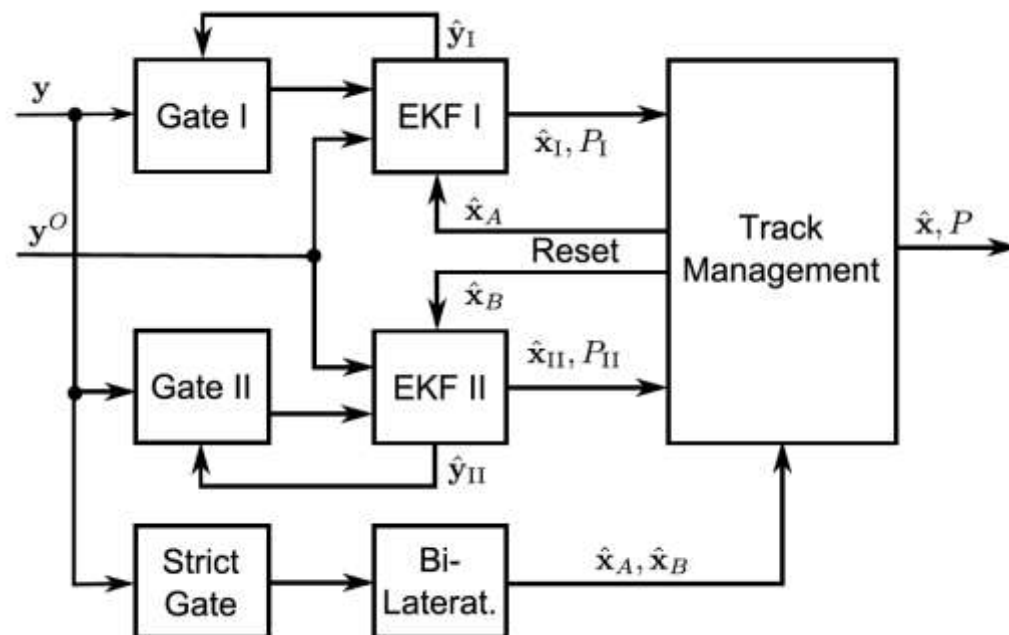
- Baseline is a strong indicator for position accuracy
- Longitudinal accuracy is better than a single distance measurement and is almost distance independent
- Lateral accuracy is much higher than longitudinal accuracy and strongly depends on distance
- Lane accuracy at Ko-FAS intersection is possible with 68% probability at least within  $> 40\text{m}$  (upper bound)
- Angle measurements have a low impact on position accuracy, but a noticeable impact on orientation estimation



## Localization Filter: Triangulation and Trilateration

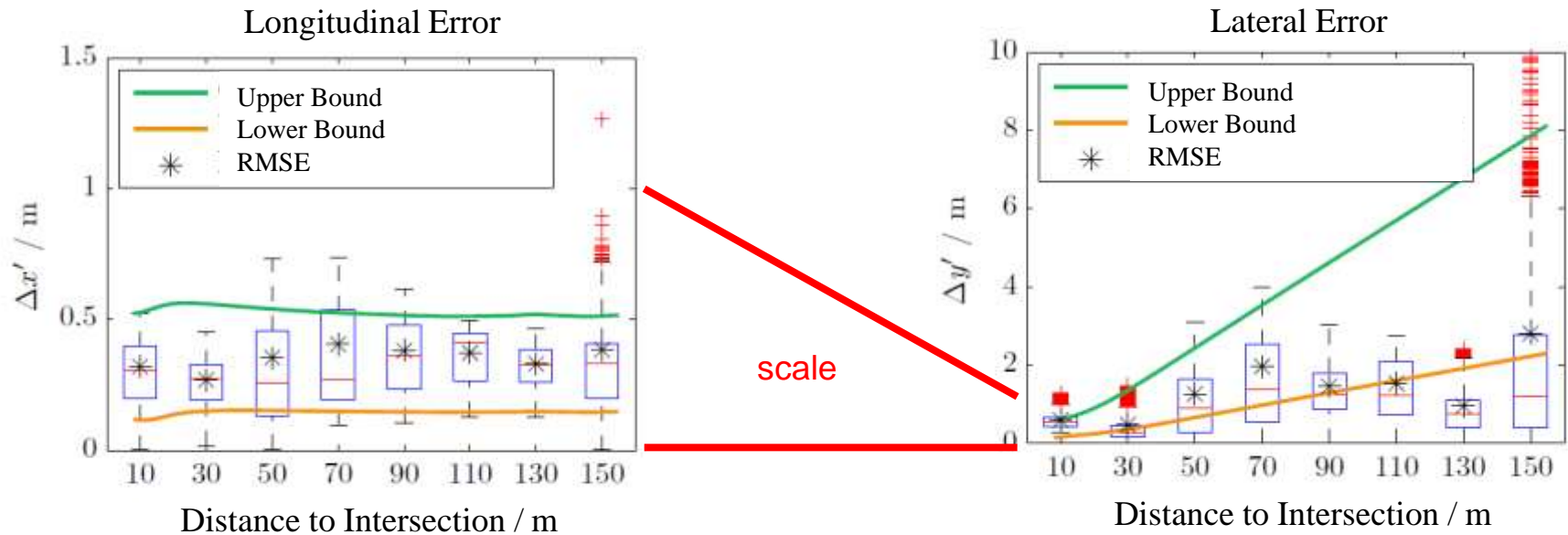
- Initialization: intersection of distances
- Gating: elimination of outliers
- State estimation: EKF
- Track management: hypothesis selection, divergence detection

- State:  $\mathbf{x} = [x, y, \gamma, v, \omega]^T$ 
  - position
  - orientation
  - vehicle dynamics



# Vehicle localization in urban environments

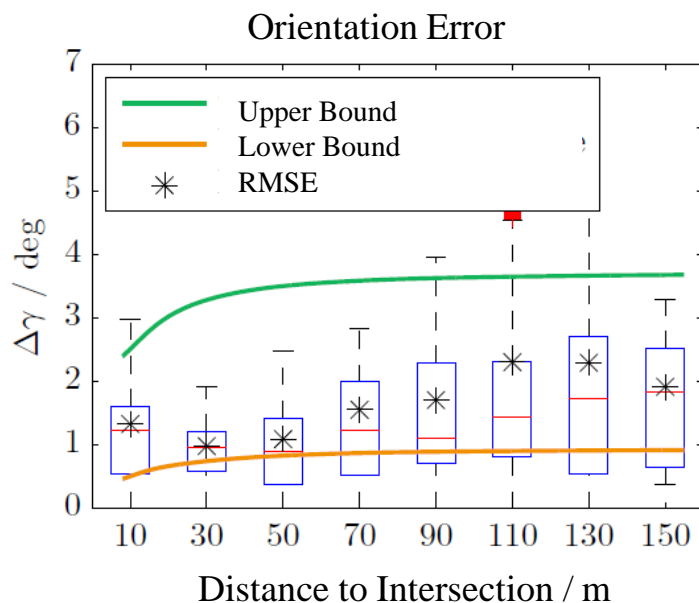
## Measurement results



longitudinal RMSE  $\approx 0.35m$ ,  
distance independent

lateral RMSE  $\approx 0.5 - 2.0m$ ,  
significant distance dependence,  
lane accuracy of RMSE  $\geq 50 - 60m$

## Measurement results

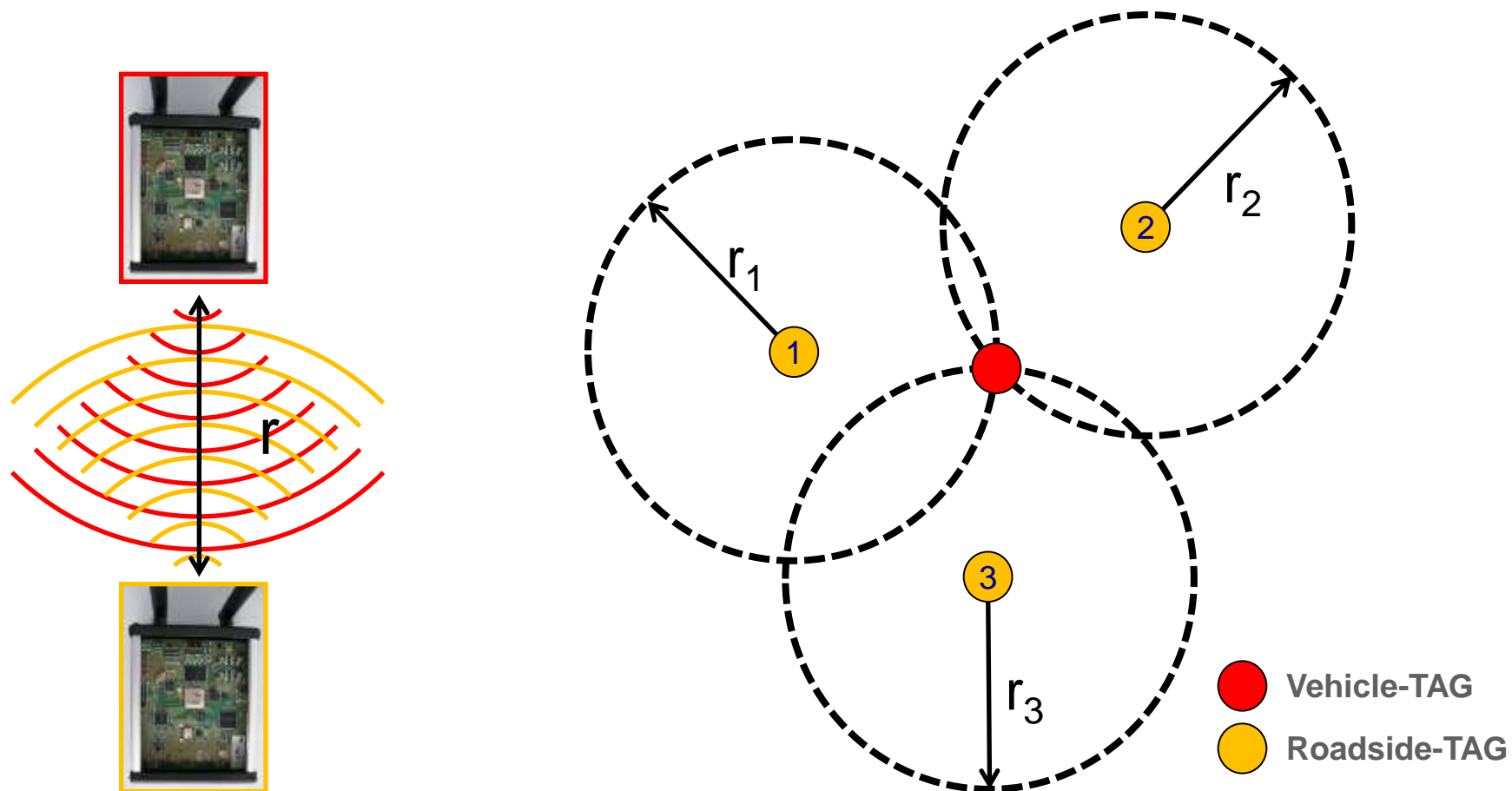


- Ground truth:
  - Generated by GNSS/INS with real-time kinematic (RTK) performance
  - Reference providing position accuracy 0.02m heading accuracy 0.1°.

orientation RMSE  $\approx 1$ -2.5°,  
approx. distance independent

# Object localization for ADAS testing: Working principle

## Lateration based on Ko-TAG 1.0 distance measurements



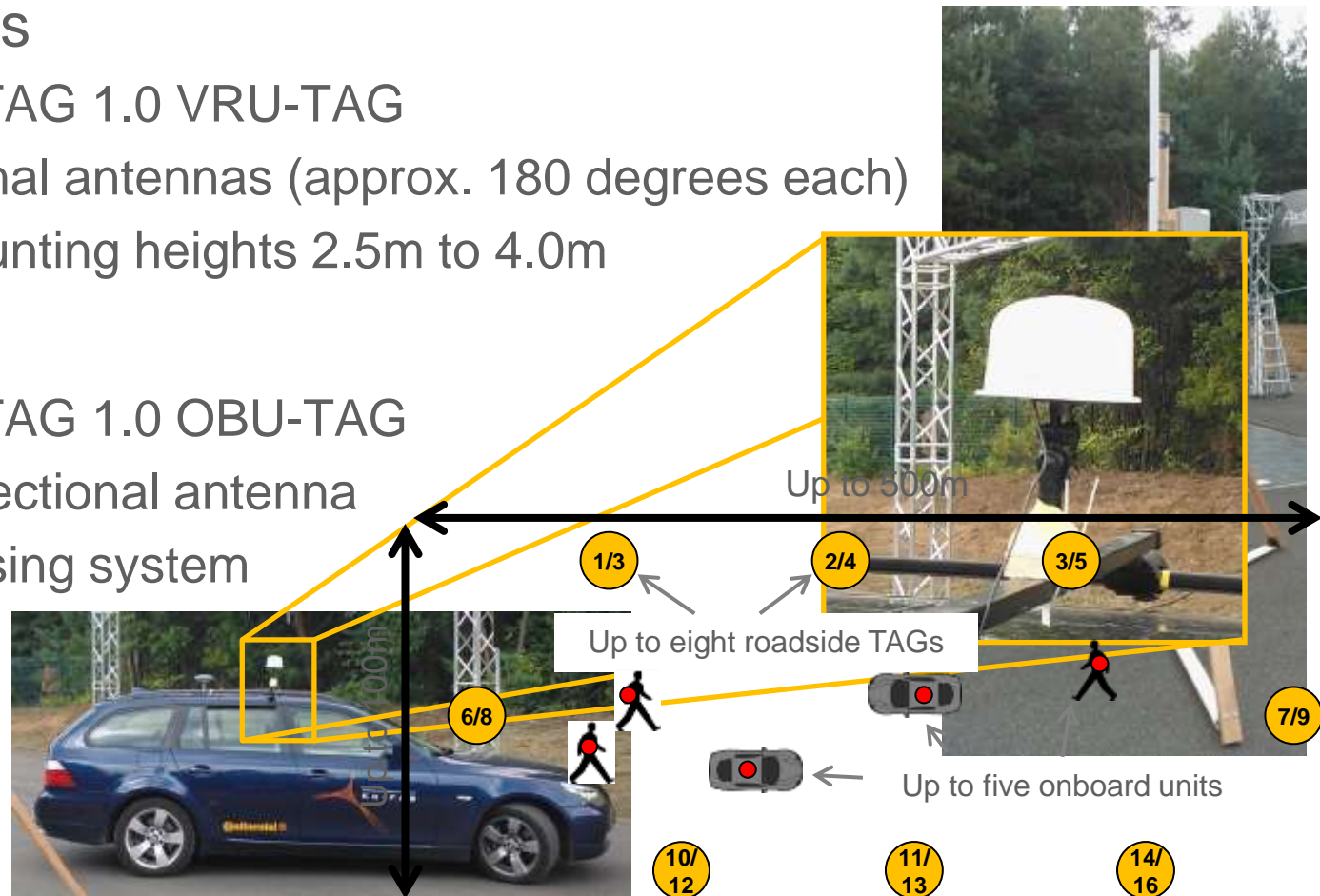
# Object localization for ADAS testing: System setup

## Roadside TAGs

- 2.4GHz Ko-TAG 1.0 VRU-TAG
- Two directional antennas (approx. 180 degrees each)
- Antenna mounting heights 2.5m to 4.0m

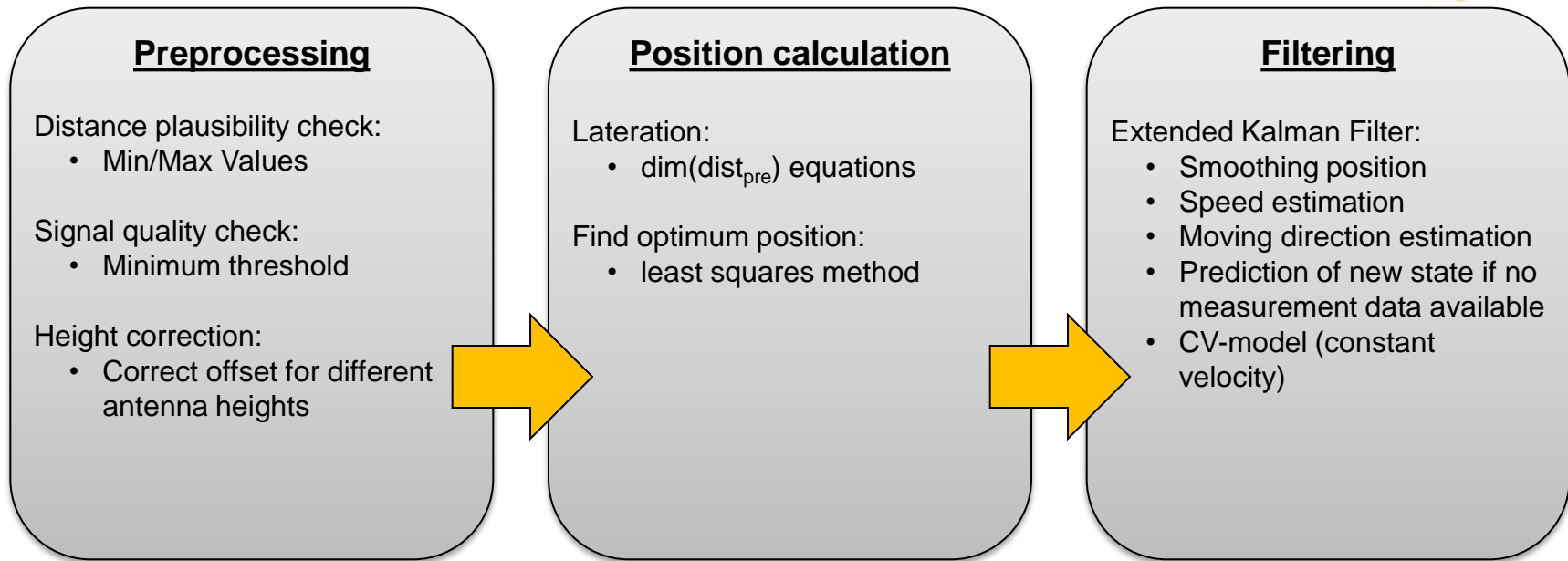
## Onboard Unit

- 2.4GHz Ko-TAG 1.0 OBU-TAG
- One omnidirectional antenna
- Data processing system





# Object localization for ADAS testing: Data processing steps



$$\text{dist}_{raw} = \begin{bmatrix} r_1 \\ r_2 \\ \vdots \\ r_7 \\ r_8 \end{bmatrix}$$

$$\text{dist}_{pre} = \begin{bmatrix} r_n \\ \vdots \\ r_m \end{bmatrix}$$

$$\text{pos}_{raw} = \begin{bmatrix} x \\ y \end{bmatrix}$$

$$\text{state} = \begin{bmatrix} x \\ v_x \\ y \\ v_y \\ \psi \end{bmatrix}$$

# Object localization for ADAS testing: Demonstration video



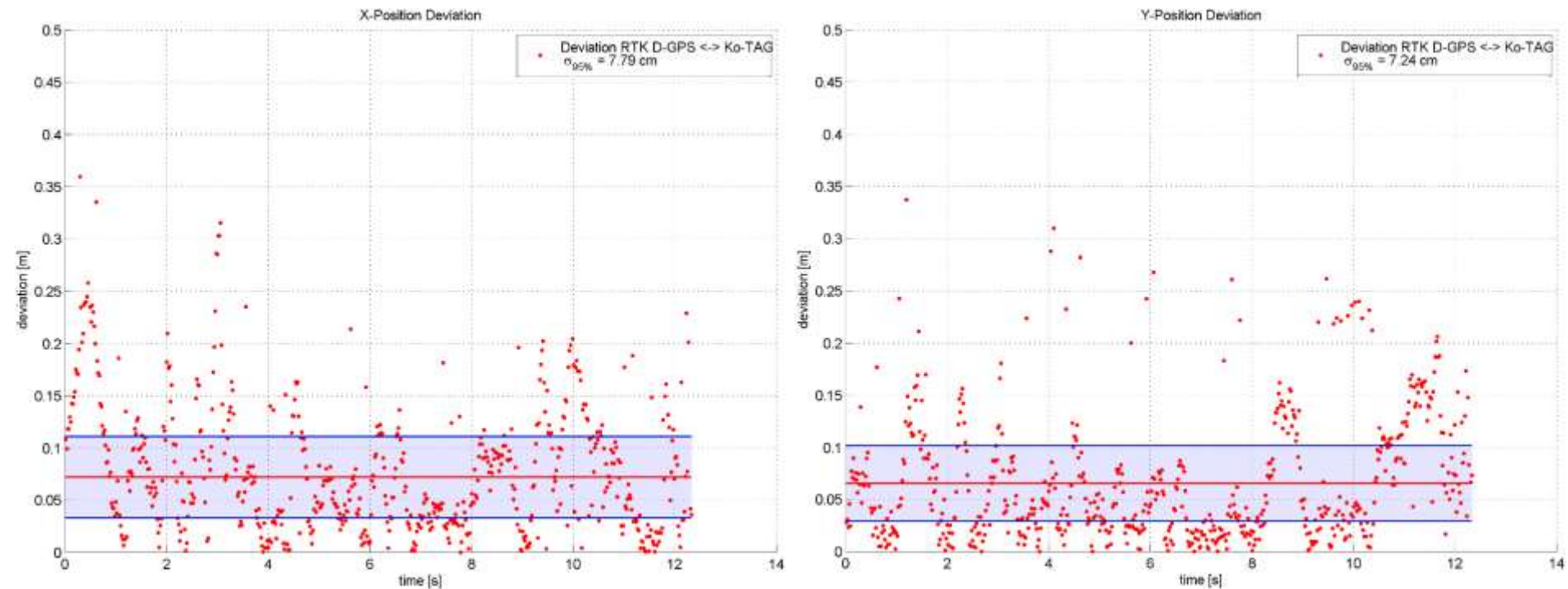
- Green:** RTK D-GPS Path
- Red:** Ko-TAG Path
- Yellow dots:** Position of roadside TAGs
- Blue:** Distance circles



# Object localization for ADAS testing: System performance



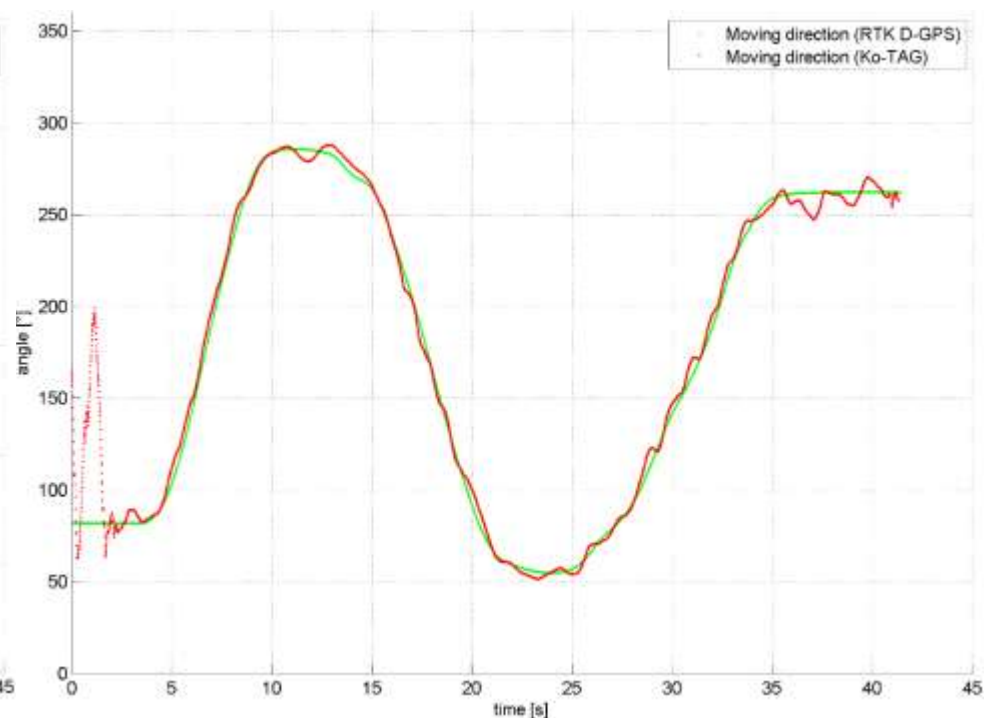
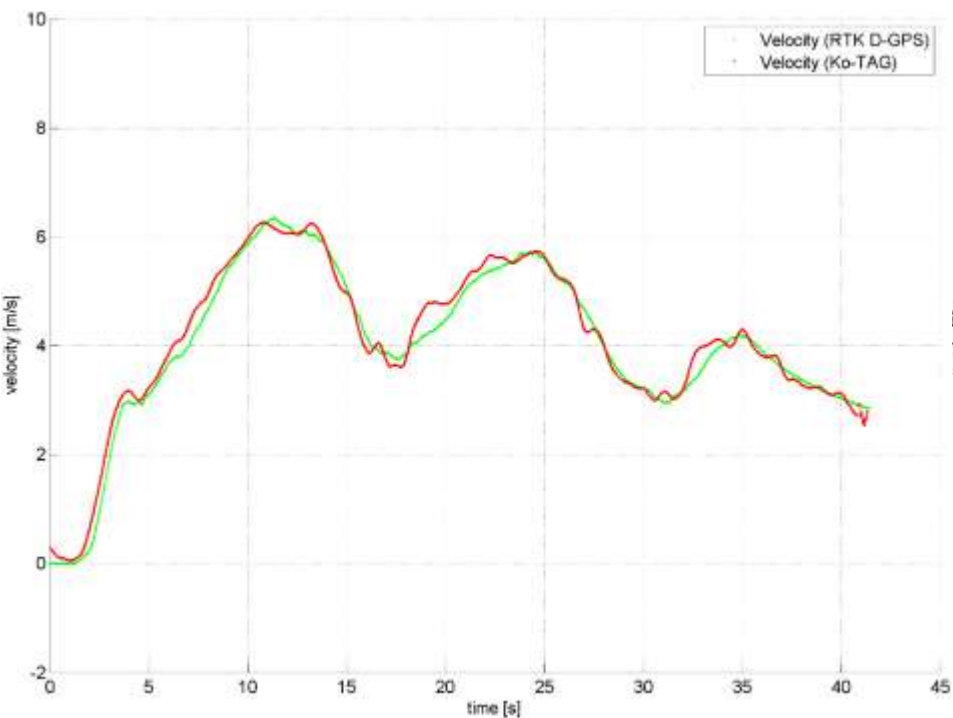
Positioning: Mean deviation X/Y to RTK D-GPS below 0,08m



# Object localization for ADAS testing: System performance



Good performance for speed and moving direction estimation



## Vehicle localization in urban environments:

- Vehicle localization system without additional modifications
- Independent of satellite navigation systems (GNSS) and digital maps
- Suited for local areas with a need for a higher precision and robustness, such as urban intersections

## Object Localization for ADAS testing:

- System is working with high accuracy
- Low cost multi localization possible
- Independent of GPS
- Prototype system is working
  - Importation of algorithms into embedded hardware to reduce complexity



# Thank you for your attention!

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