

A Two-Level Stochastic Model for the Lateral Movement of Vehicles Within Their Lane Under Homogeneous Traffic Conditions

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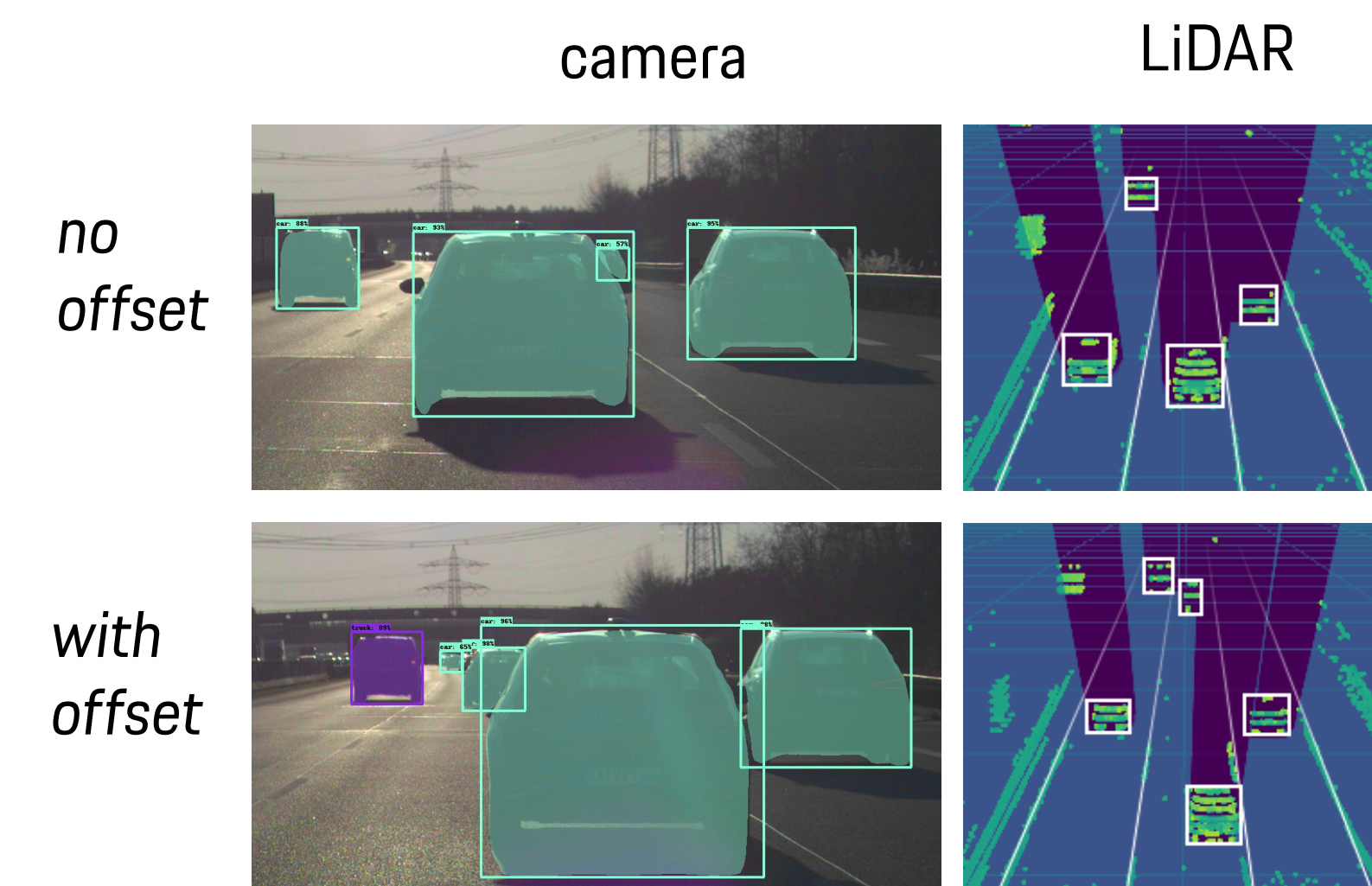


paper link



Motivation

Effect of the lateral movement of vehicles within their lane on the range of vision of vehicle sensors



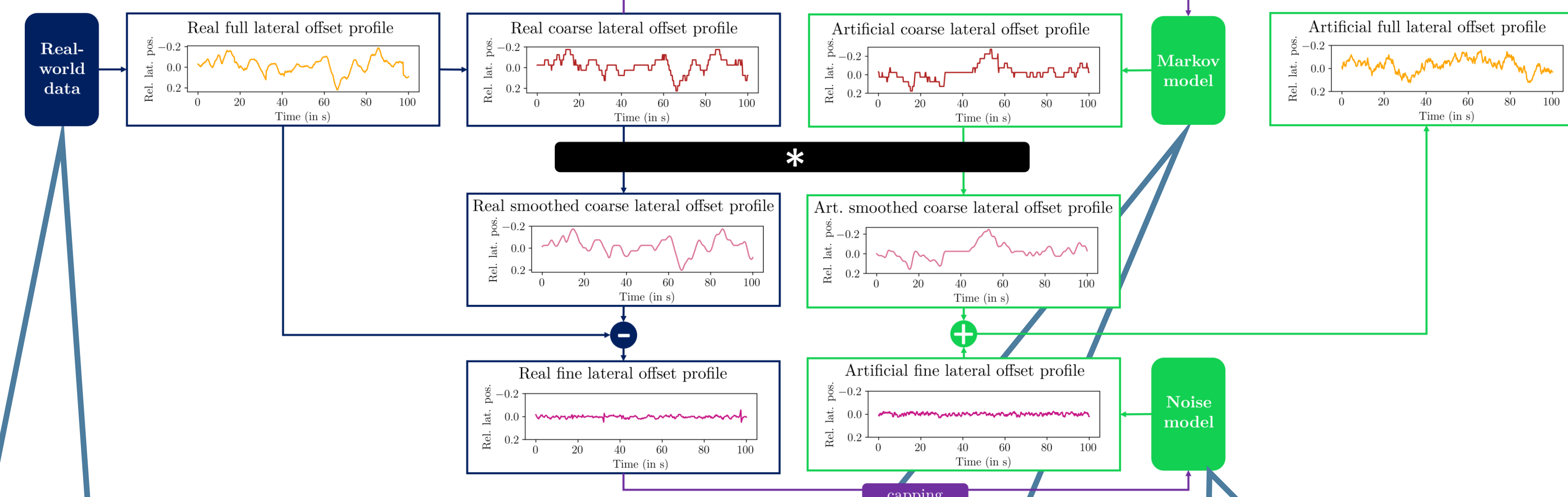
→ Important to consider the lateral movement within simulations used for the virtual validation of automated driving functions via so called submicroscopic behavior models

Model

Applicability: Highways under free flow traffic conditions (velocities higher than 40 km/h), Lane following maneuvers (as opposed to lane changes)

Core Idea: For time steps i lateral movement $x(i)$ is given as $x(i) = \kappa(i) + \phi(i)$ with

- **Coarse movement $\kappa(i)$:** discrete lateral position, systematic behavior
- **Fine movement $\phi(i)$:** continuous behavior, stochastically independent from coarse

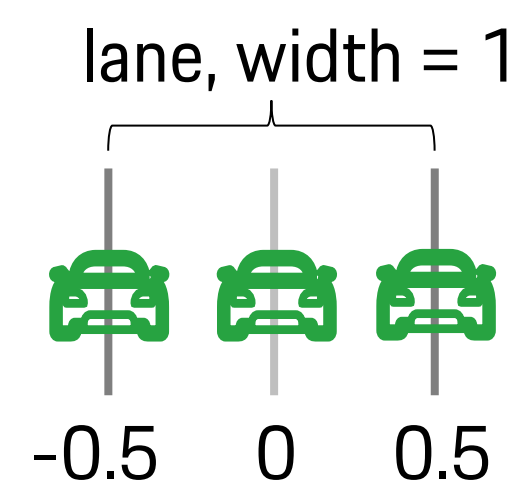


Related Work

- Existing microscopic traffic simulation tools neglect lateral movement except for lane changes [1] or target heterogeneous traffic conditions [2]
- Only a few submicroscopic behavior models enabling continuous lateral movement under homogeneous traffic conditions are proposed in literature [3,4]
- All calibrated based on NGSIM dataset, thus model only general (not driver-specific) behavior and are restricted to short-term data, might be affected by inaccuracies in data

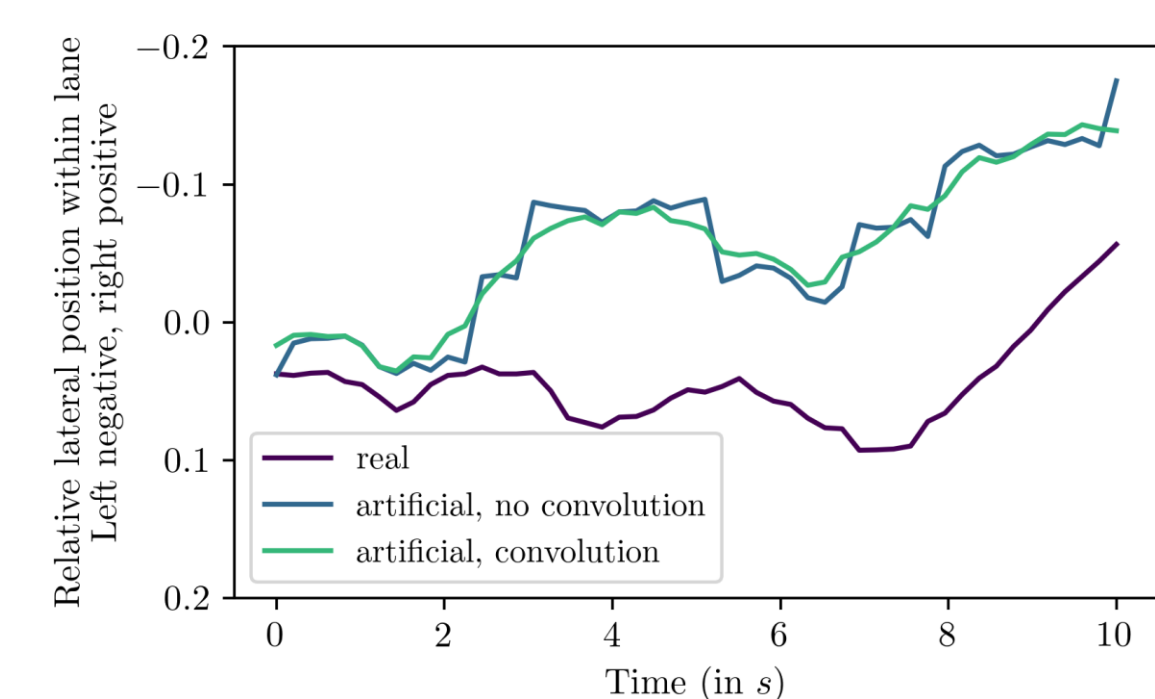
Dataset

- Two real-world datasets recorded on German highways with a Porsche Cayenne as described in [5]
- Each tour driven by single (but different) driver
- Ca. 50 min usable data/dataset
- Use of relative lateral position:



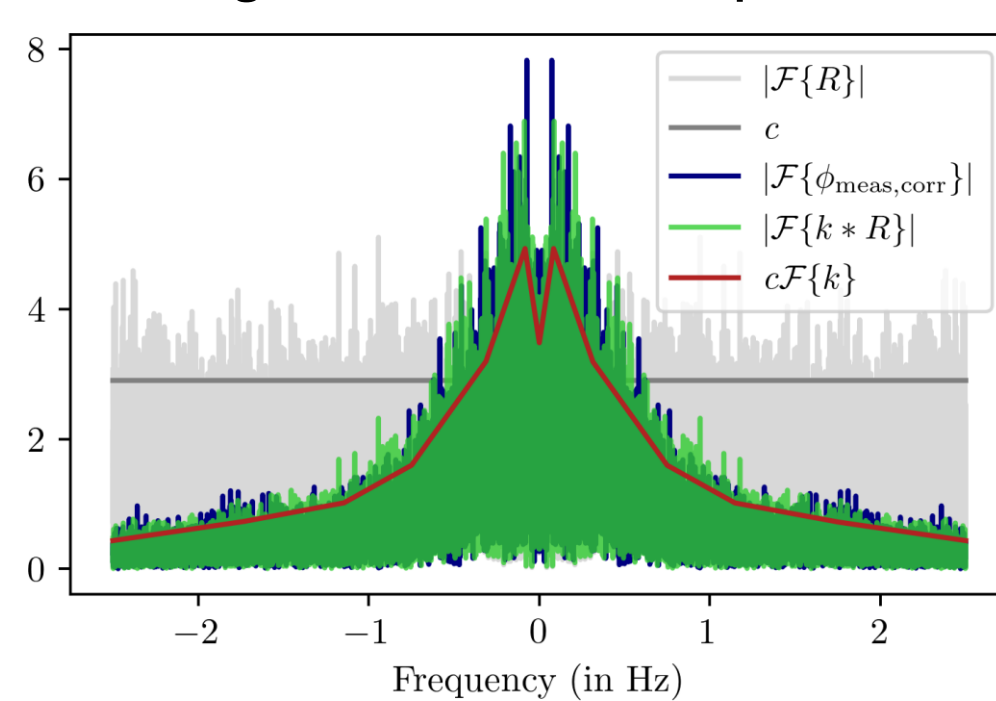
Markov model

- Coarse movement $\kappa(i)$ via Markov chain over n_c segments of width $1/n_c$
- Resulting in step function, whose jumps cannot be compensated by fine movement
- Thus, convolution with kernel g_s : $\kappa = \hat{\kappa} * g_s$



Noise model

- Capping to achieve stochastic independence giving $\phi_{meas,corr}$
- Modelling of fine movement via $\phi = R * k$ with R white noise, k a convolution kernel
- Fitting within Fourier space:



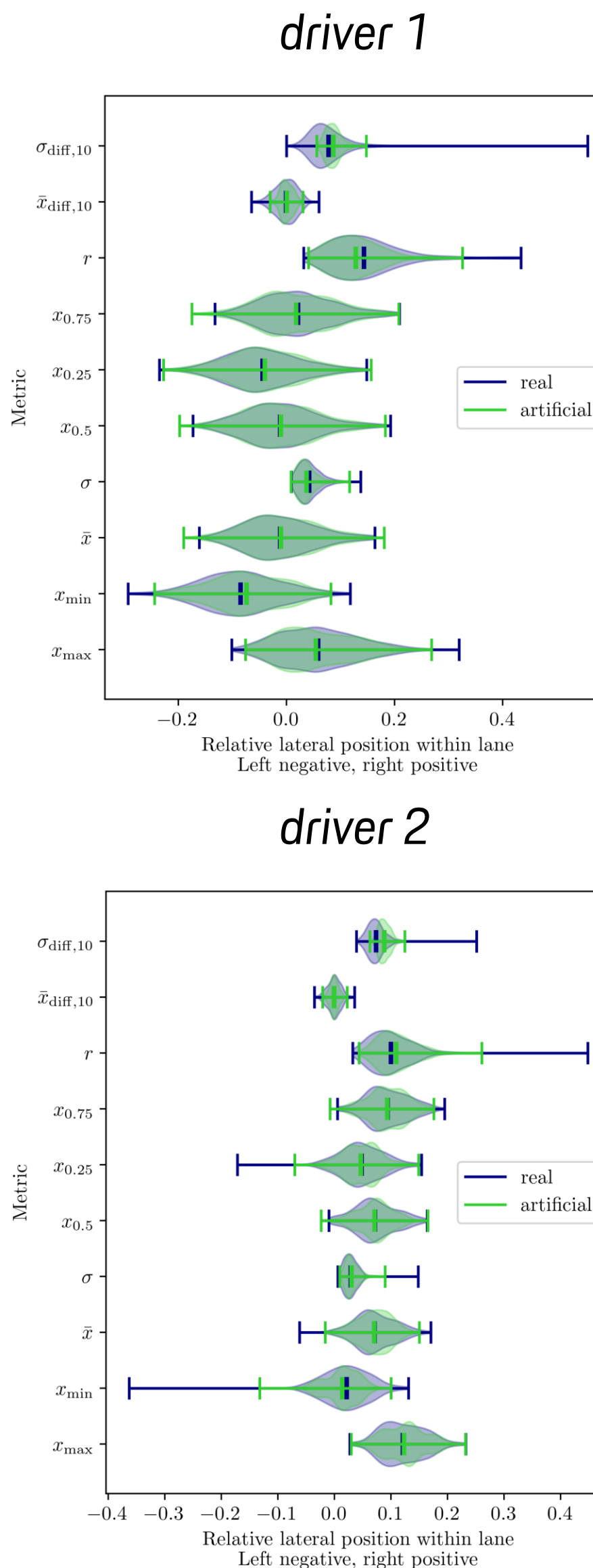
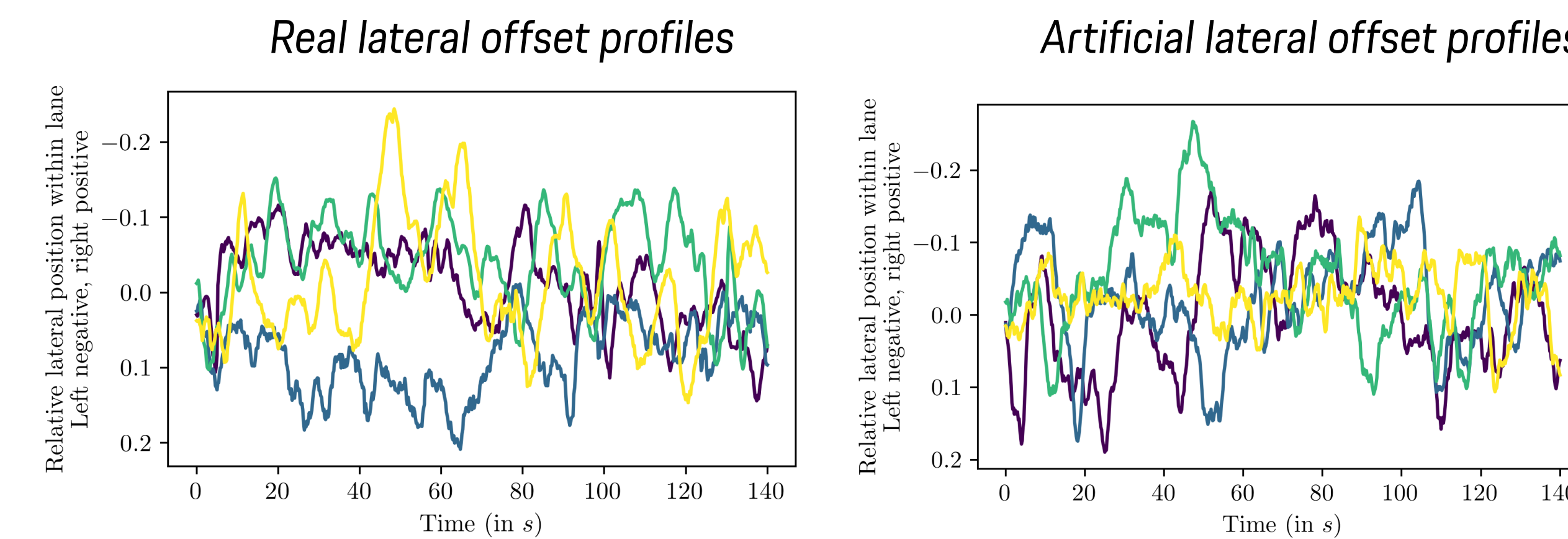
Results

Runtime: 10 000 times faster than real time

Quantitative results: evaluation of real and artificial lateral offset snippets $X = [x_0, \dots, x_m]$ of 10 s duration using ten metrics for two different model calibrations (one per single-driver dataset)

Metrics on X : x_{max} (maximum), x_{min} (minimum), \bar{x} (mean), σ (standard deviation), $x_{0.5}$ (median), $x_{0.25}$ (25 % percentile), $x_{0.75}$ (75 % percentile), r (range), $\bar{x}_{diff,10}$ (10x mean difference of two consecutive values), $\sigma_{diff,10}$ (10x standard deviation of difference of two consecutive values)

Qualitative results (same color = same start position)



Conclusion

- Development of two-level stochastic model for the lateral movement of vehicles within their lane under homogeneous traffic conditions
- Good agreement for eight out of the ten metrics
- Capable to cover characteristics of different tours
- Extremely fast (10 000 times real time)
- Currently only considering general lateral movement
- Next steps are enhancement to consider other influences on lateral offset behavior such as vehicles on neighboring lanes, longitudinal velocity of ego vehicle, etc.
- Improvement of metrics on difference of consecutive time steps

References

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- [2] M. Fellendorf and P. Vortisch, "Microscopic Traffic Flow Simulator VISSIM," in Fundamentals of Traffic Simulation (J. Barceló, ed.), vol. 145, pp. 63–93, New York, NY: Springer New York, 2010.
- [3] R. Delpiano, "Understanding the Lateral Dimension of Traffic: Measuring and Modeling Lane Discipline," Transportation Research Record, vol. 2675, pp. 1030–1042, Dec. 2021.
- [4] H. Qi, Y. Ying, and J. Zhang, "Stochastic lateral noise and movement by Brownian differential models," in 2022 IEEE Intelligent Vehicles Symposium (IV), (Aachen, Germany), pp. 98–103, IEEE, June 2022.
- [5] J. Haselberger, M. Pelzer, B. Schick, and S. Müller, "JUPITER – ROS based Vehicle Platform for Autonomous Driving Research," in 2022 IEEE International Symposium on Robotic and Sensors Environments (ROSE), (Abu Dhabi, United Arab Emirates), pp. 1–8, IEEE, Nov. 2022.