Out of distribution detection in 3D semantic segmetation models

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Motivation

- We study the out of distribution(OOD) detection in 3D semantic segmentation setting using the uncertainty estimation proposed in [1].
- Recent days, study of OOD is important for the safety and access the performance of the models especially in context of autonomous driving.
- Examples for importance of OOD is discussed in next slide.

¹S. Bhandary, N. Hochgeschwender, P. Plöger, F. Kirchner, and M. Valdenegro Toro. Evaluating uncertainty estimation methods on 3d semantic segmentation of point clouds. arXiv e-prints, pages arXiv-2007, 2020.

Motivation - Examples

- The following two examples specify why OOD is required for safety in real world applications.
- ► The below two misdetections question the safety and performance of model in Tesla autopilot.



Figure: Tesla autopilot detecting the moon as the yellow sign board [1]



Figure: Another misdetection from tesla autopilot, burger king sign as stop sign board [1]

¹T. Levin. Tesla's full self-driving tech keeps getting fooled by the moon, billboards, and burger king signs, 2021.

Research questions

The research questions answered in this thesis are:

- RQ1 How to create a benchmark over 3D segmentation datasets for the out of distribution(OOD) setting? i.e., create the in and the out distribution datasets.
- RQ2 How to extend the current OOD detection methods from 2D classification task to 3D semantic segmentation?
- RQ3 Is uncertainty quantification an effective approach to classify the OOD detection in 3D semantic segmentation models?
- **RQ4** How to evaluate the OOD detection over the 3D semantic segmentation task?

Deliverables

Minimum Viable

- Systematic literature survey of
 - Datasets in 3D LiDAR semantic segmentation.
 - Existing out of distribution methods.
 - 3D models for semantic segmentation on LiDAR data.
- Proposal of 3D benchmarking datasets for out of distribution detection.
- Study of uncertainty estimation over 3D models for OOD detection.
- Extension of OOD detection method to a baseline 3D model.

Deliverables

Expected

- Systematic evaluation of the extended baseline model over the benchmarked dataset.
- Extension of the state of the art model for OOD detection.
- Evaluation and comparison of the extended state of the art model to baseline algorithm.

Desired

- ▶ Draft a research paper with the insights/findings from thesis.
- Proposal of a refinement over the current OOD model for higher performance.