

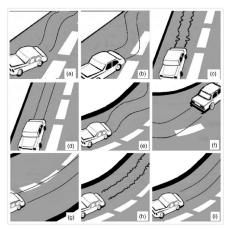
# **Master's Project**

# Hierarchical Clustering of Motion Planning Preferences

# Description

One of the goal of robotics is to make sure that robots can move according to a motion plan. The motion plan can also include spatial/temporal preferences e.g. where the robot should go and how fast it should complete its task. To that end, Signal Temporal Logic (STL) [1] can be used to shape the robot's trajectories. It is a formalism to specify complex tasks and to characterize (desired) behaviours of systems in a machineinterpretable way.

This project will focus on learning a specification from data. There exist recent data-based approaches [2-4] which include observed trajectories of the robot. To obtain accurate and tight results, this process usually requires that the trajectories only



belong to a single target specification. Nevertheless, in reality, trajectories are recorded from multiple specifications during the operation of a system. For instance, an autonomous vehicle performs different manoeuvres during its operation, depending on the current traffic situation. Another example spans different driving styles one can encounter while driving: from careful driving styles to more aggressives.

## Goals

Your task will be to develop a hierarchical clustering approach to separate the trajectories into distinct subsets. Each of these subsets should belong to a different target specification. Therefore, you need to determine suitable metrics [5] and identify clustering approaches to separate the trajectories, e.g., using their frequency spectrum.

### Requirements

The project is suitable for students interested in the fields of robotics, formal methods and machine learning. An excellent command of Python is required.

### Contacts

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### References

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