

Advanced Methods for Behavior Planning

C4M5L5 by Marko Illievski



UNIVERSITY OF TORONTO
FACULTY OF APPLIED SCIENCE & ENGINEERING

State Machine Behaviour Planning Issues

- Rule-explosion when Dealing with Complex Scenarios
- Dealing with a Noisy Environment
- Hyperparameter Tuning
- Incapable of Dealing with Unencountered Scenarios

Rule-Based Behaviour Planner

- Hierarchy of rules
 - Safety critical
 - Defensive driving
 - Ride comfort
 - Nominal behaviours
- Reduced need for duplication
 - Rules can apply throughout ODD
- Suffer from same challenges as finite state machines
 - Common to all expert system designs

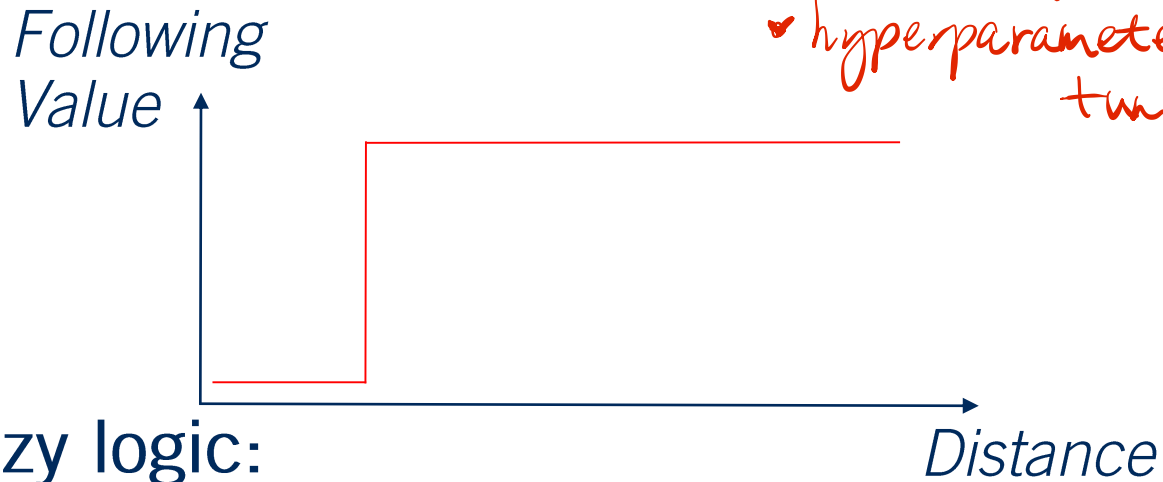
Operational design domain

relies on expert users to design for all possible scenarios.

Fuzzy Logic

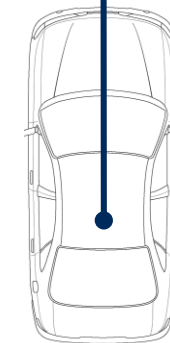
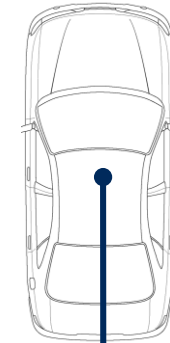
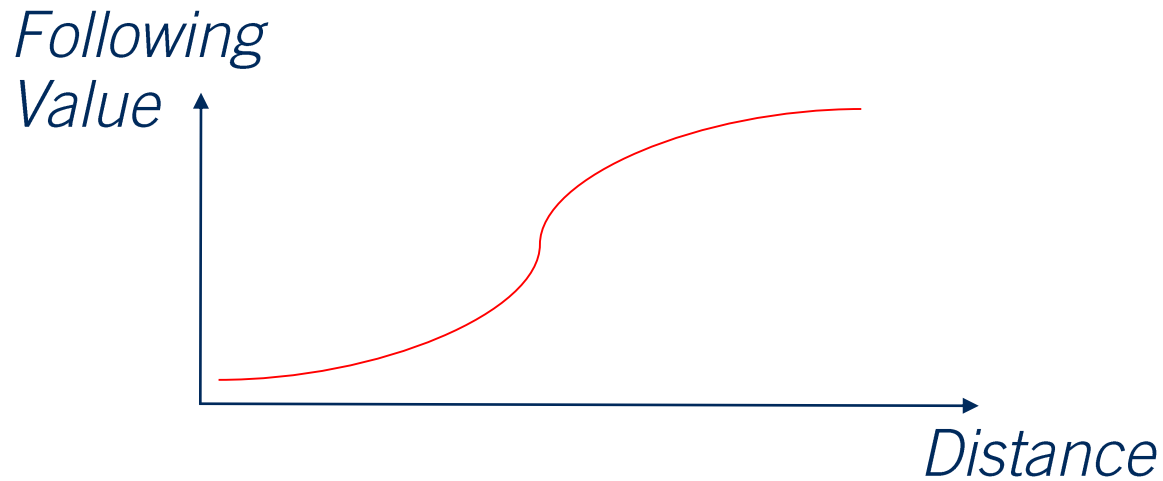
Human expert

Non Fuzzy logic:

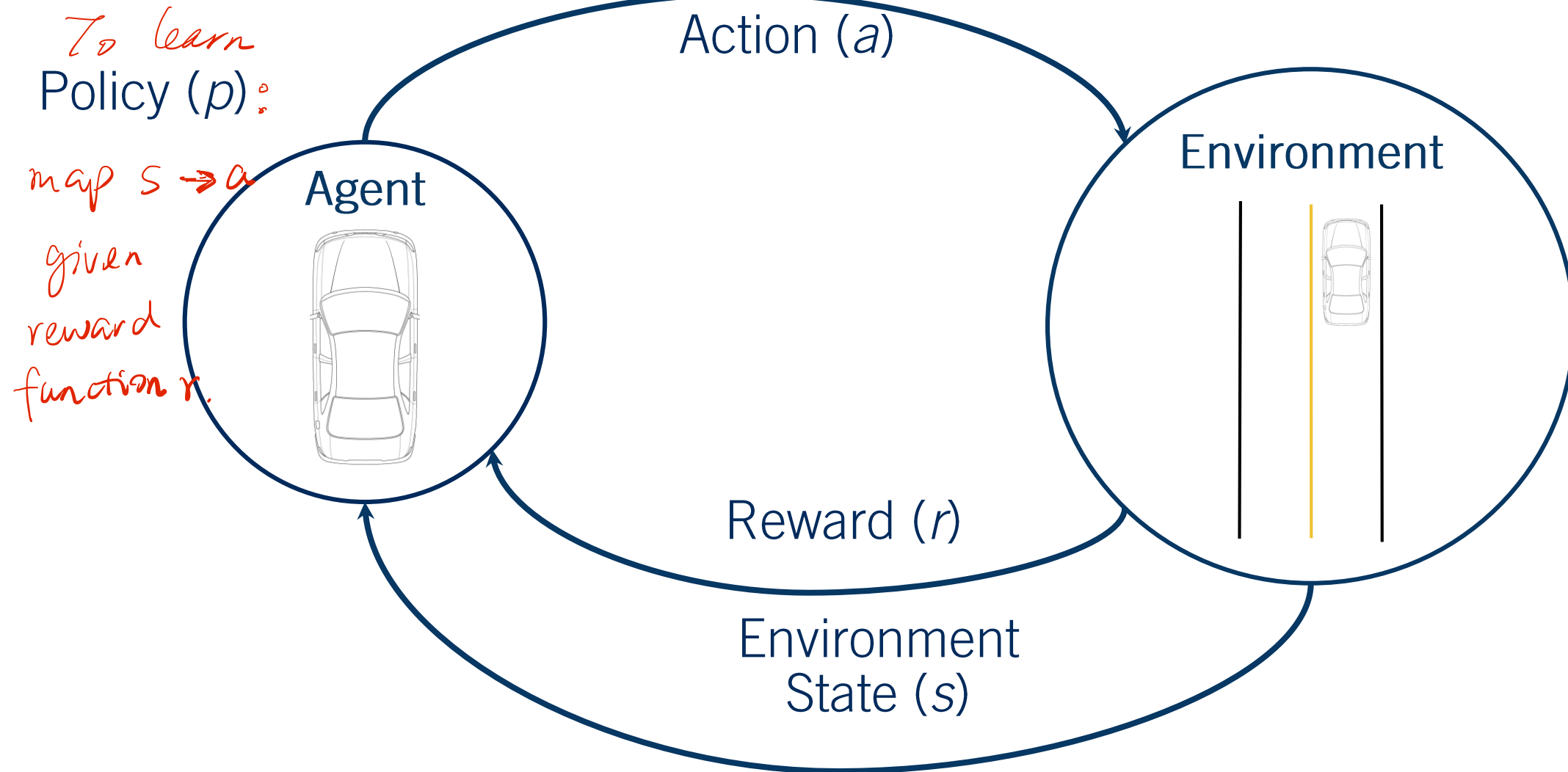


Pros: can deal with environmental noise somewhat
Cons: rule explosion
hyperparameter tuning.

Fuzzy logic:

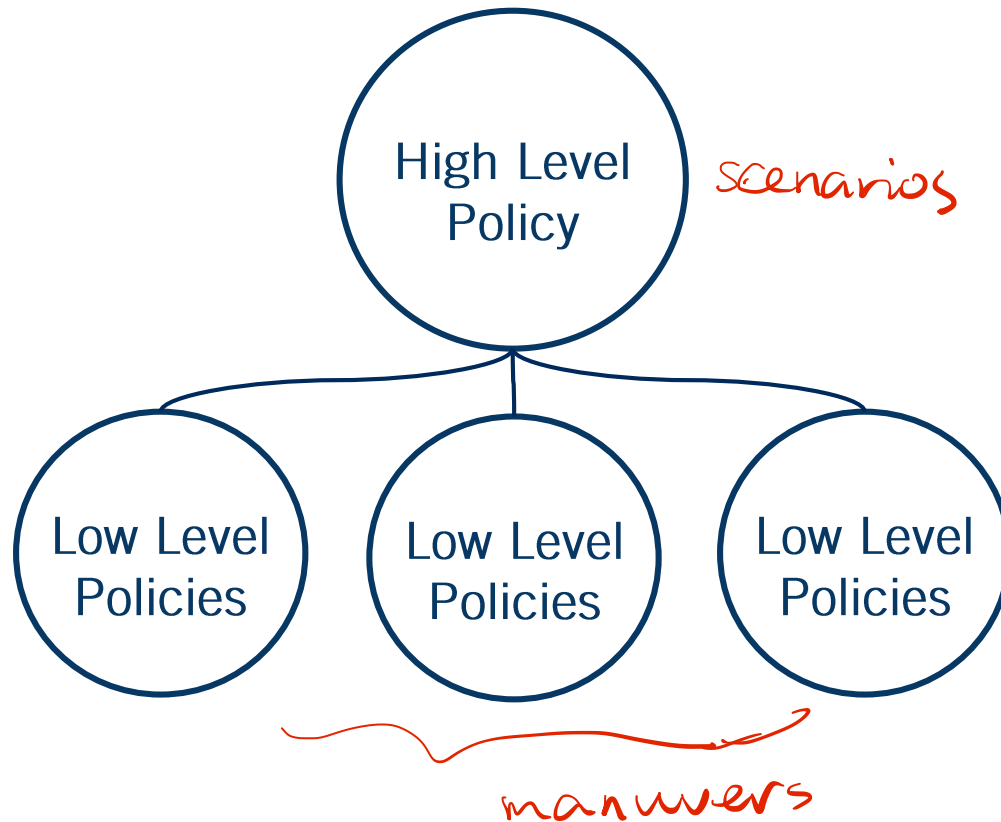


Reinforcement Learning

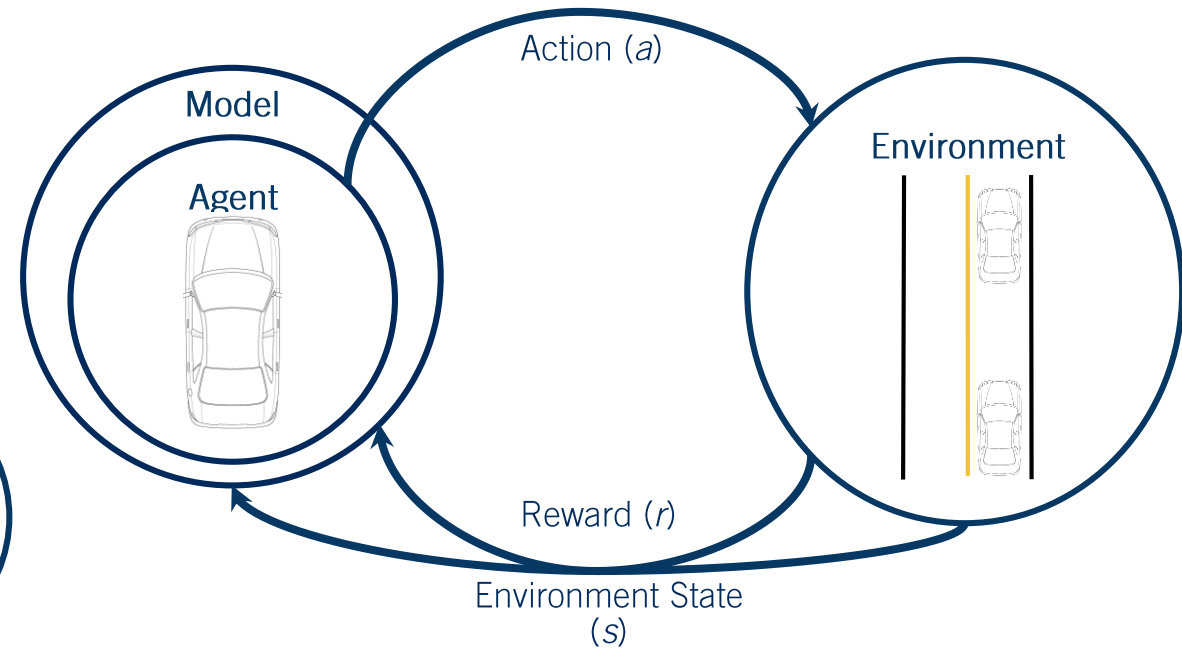


Reinforcement Learning

Hierarchical Reinforcement Learning



Model-based Reinforcement Learning



Reinforcement Learning Issues

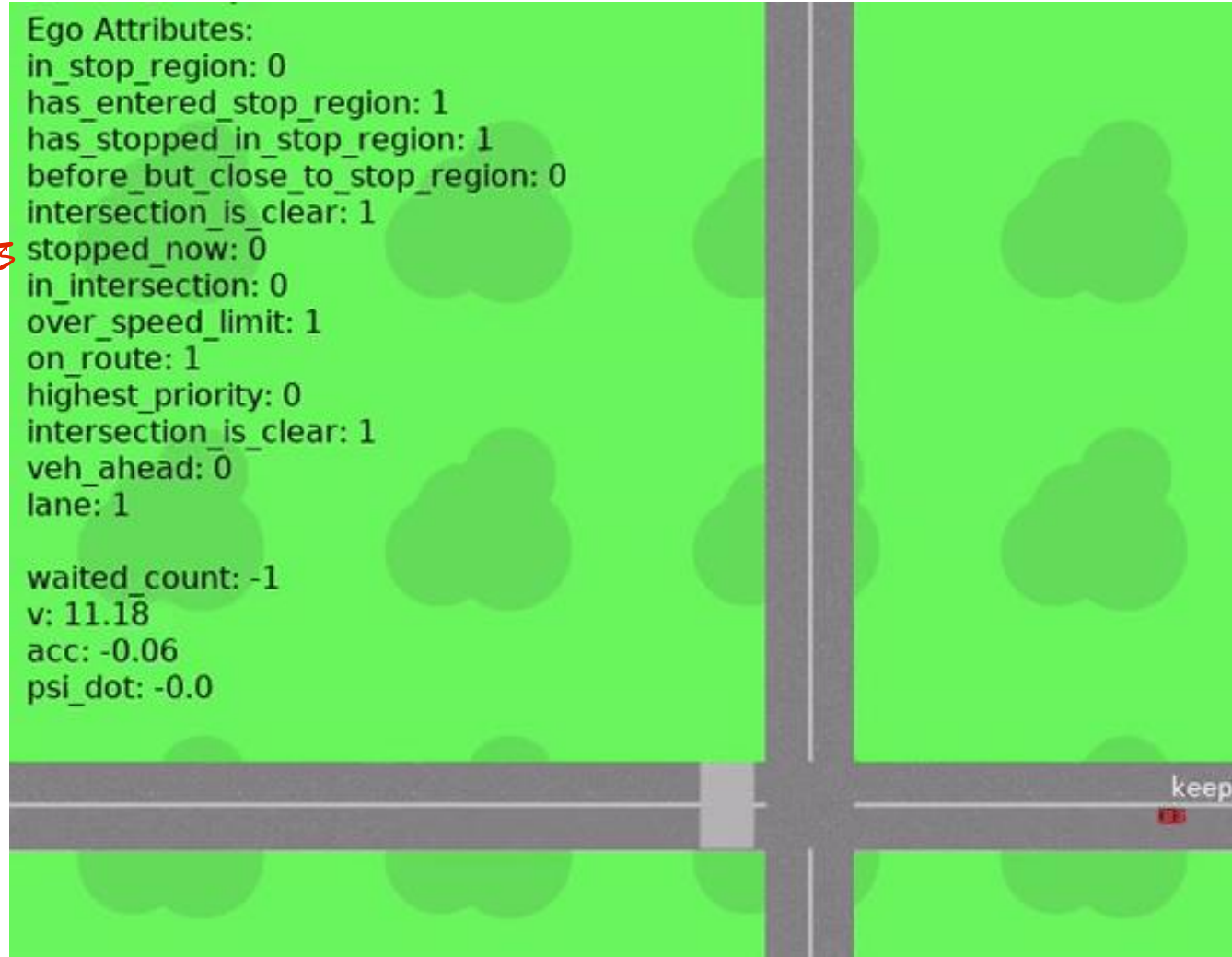
- Simple Simulation Environments

*may not be transferrable to
real world environments*

- Ensuring Safety

*no rigorous
safety assessment.*

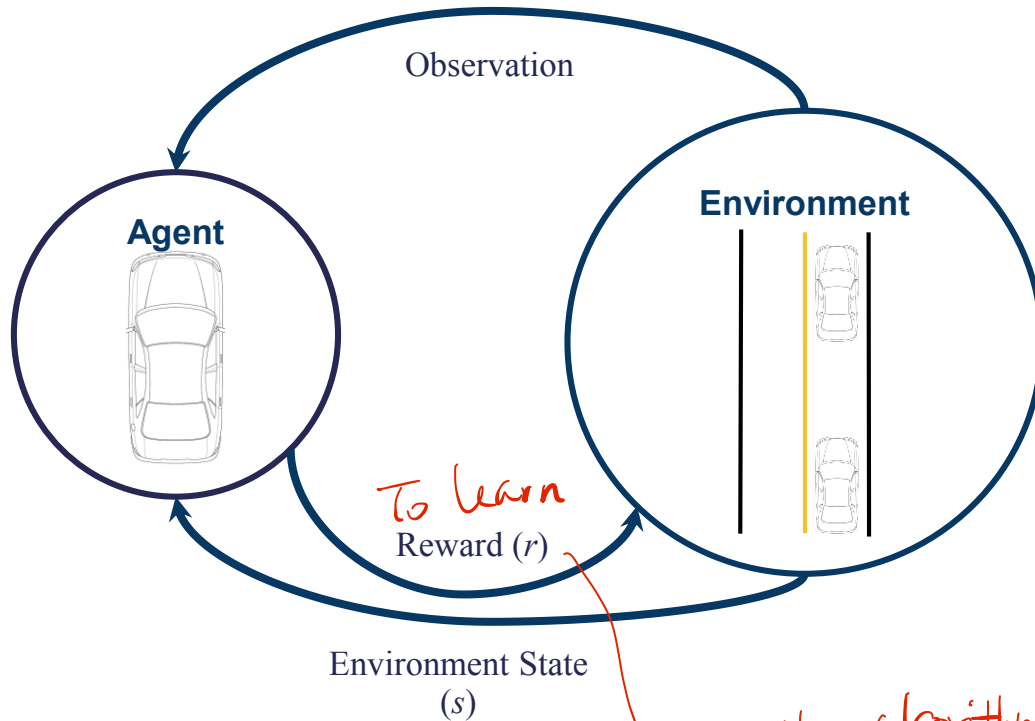
```
Ego Attributes:  
in_stop_region: 0  
has_entered_stop_region: 1  
has_stopped_in_stop_region: 1  
before_but_close_to_stop_region: 0  
intersection_is_clear: 1  
stopped_now: 0  
in_intersection: 0  
over_speed_limit: 1  
on_route: 1  
highest_priority: 0  
intersection_is_clear: 1  
veh_ahead: 0  
lane: 1  
  
waited_count: -1  
v: 11.18  
acc: -0.06  
psi_dot: -0.0
```



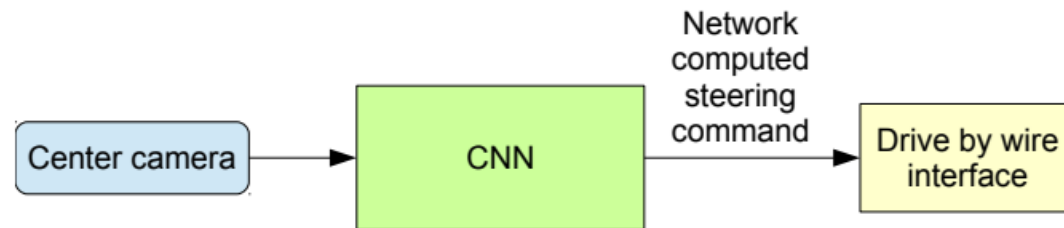
Machine Learning

Behavior planning bottleneck:
achieving real world level 5 autonomy.

Inverse Reinforcement Learning



End-to-End Approaches



after that, the algorithm
can execute driving maneuvers similarly to a
human driver.

Summary

- Identify issues with the state machine based behaviour planner
- Identify the open areas of research in behaviour planning
- **Next:** Building a full local planning solution