#### **RESEARCH DAYS - NOVEMBER 2020**

# Continuously learning complex tasks via symbolic analysis

Presented by Ali Younes, Ecole Polytechnique, ENSTA





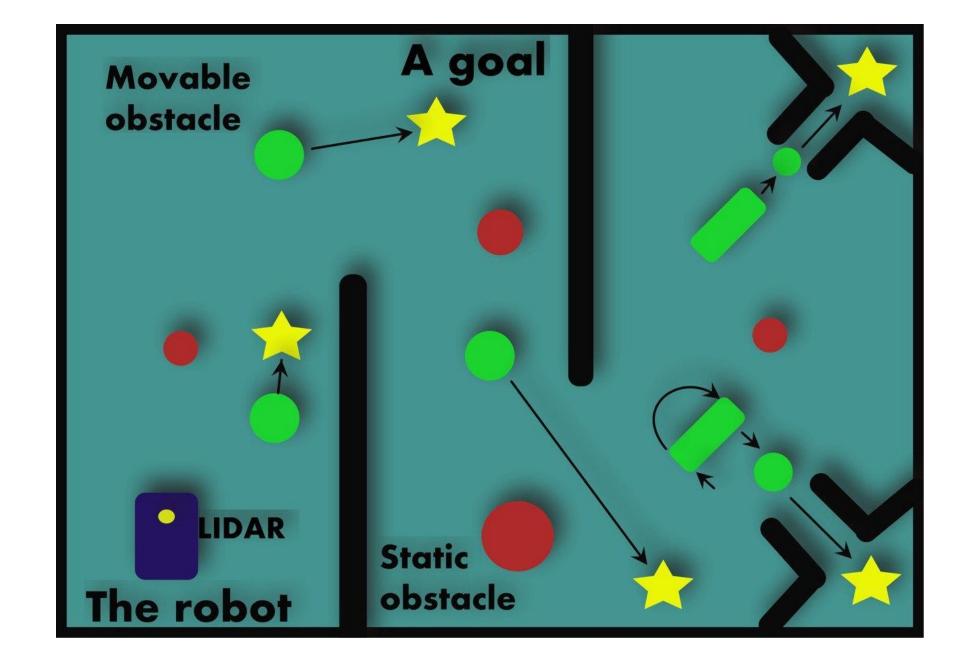


### Continual Learning

• The Continual learning problem is defined as the ability to incrementally learn and expand the knowledge by gaining new skills and expertise.

• A system of a mobile robot pushing object to goals could represent a continual learning

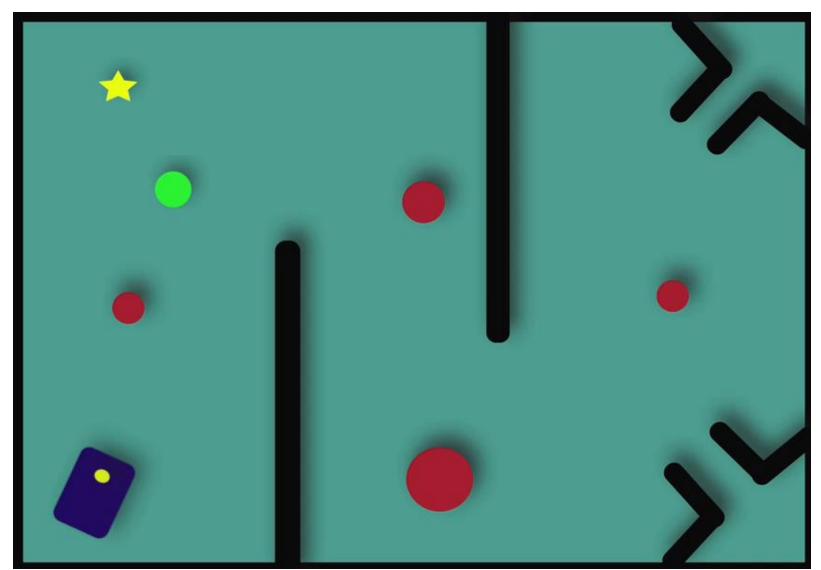
problem.

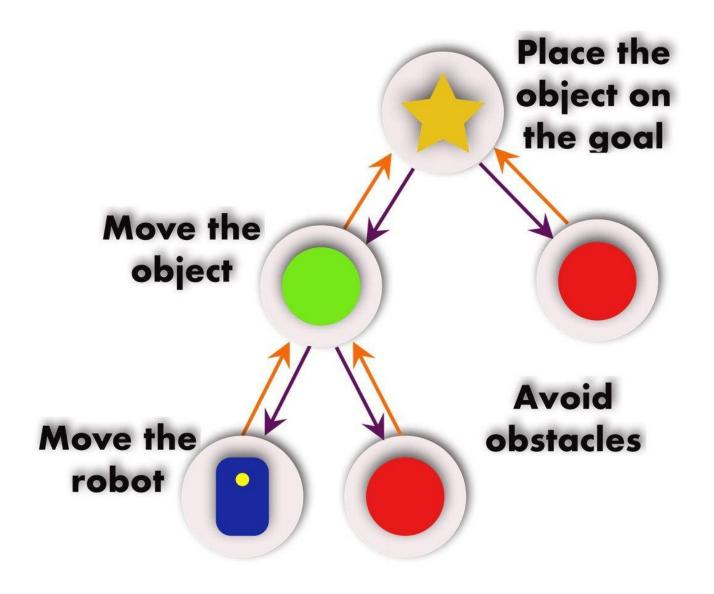




### Hierarchical continual Learning

- The robot dissect the task into simpler tasks, and build a hierarchy of skills to solve the task.
- In the first part of the task, the robot use the hierarchy:

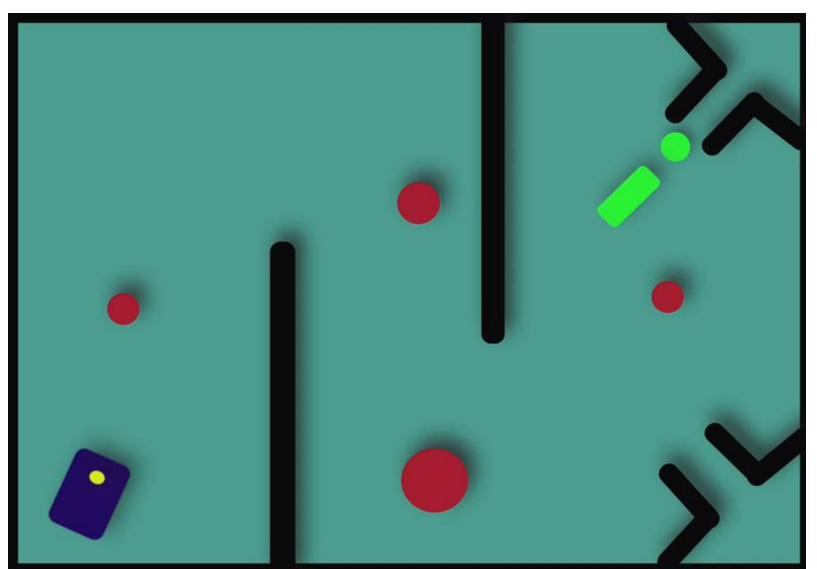


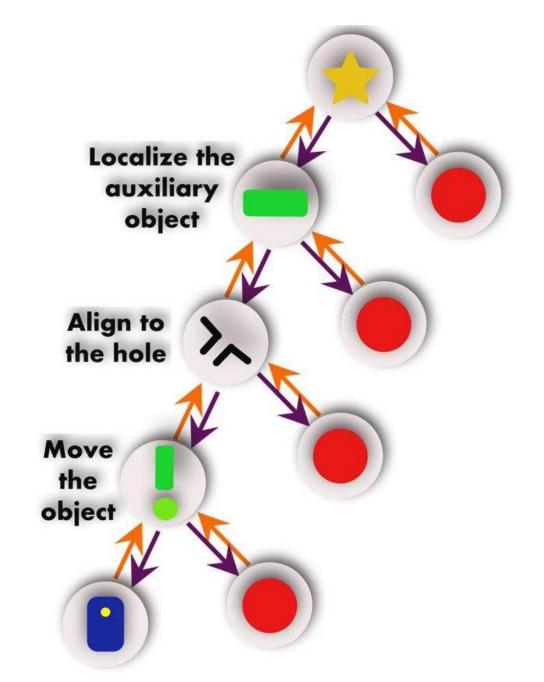




# Hierarchical continual Learning

- The robot dissect the task into simpler tasks, and build a hierarchy of skills to solve the task.
- In the second part of the task, the robot has to extend the hierarchy:

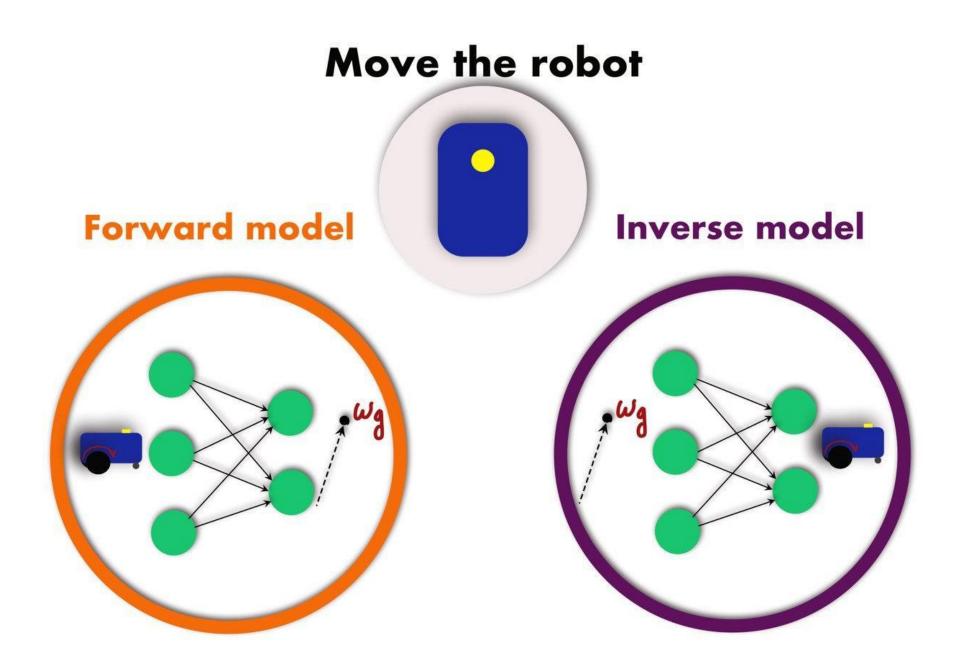






# Planning in hierarchical learning

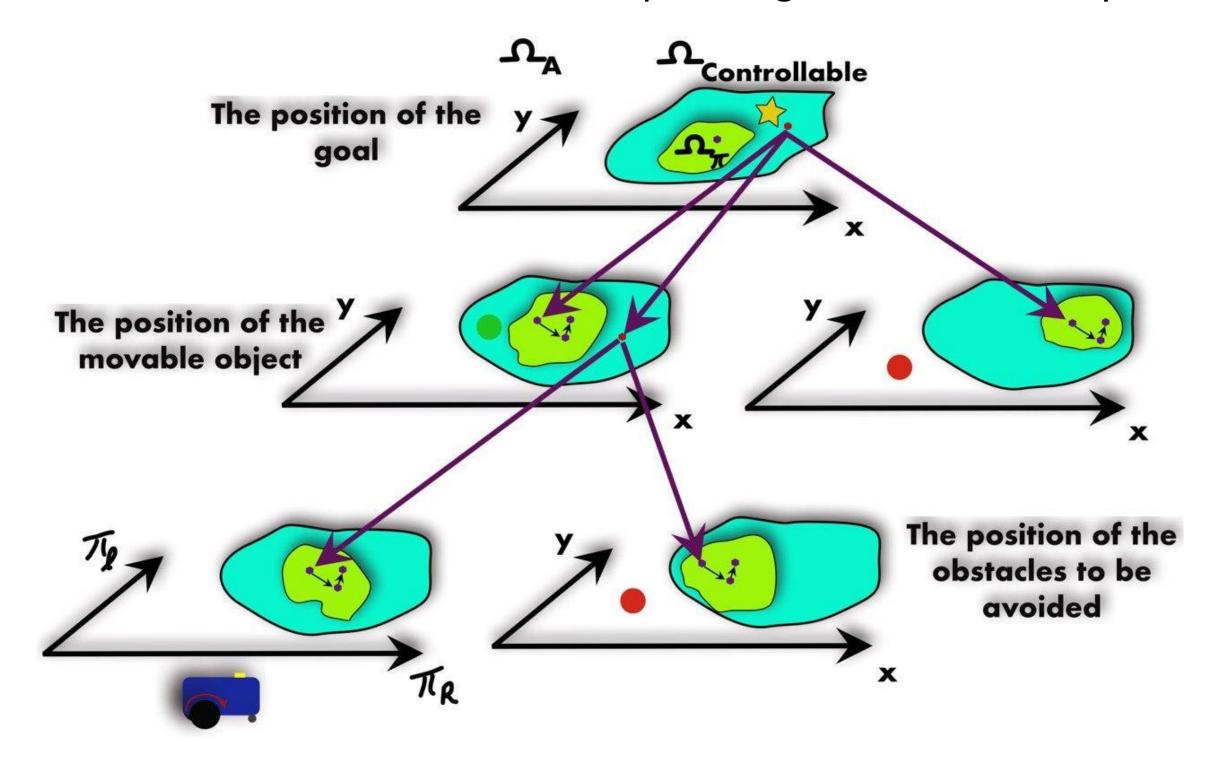
• Each skill has a forward and an inverse model.





# Planning in hierarchical learning

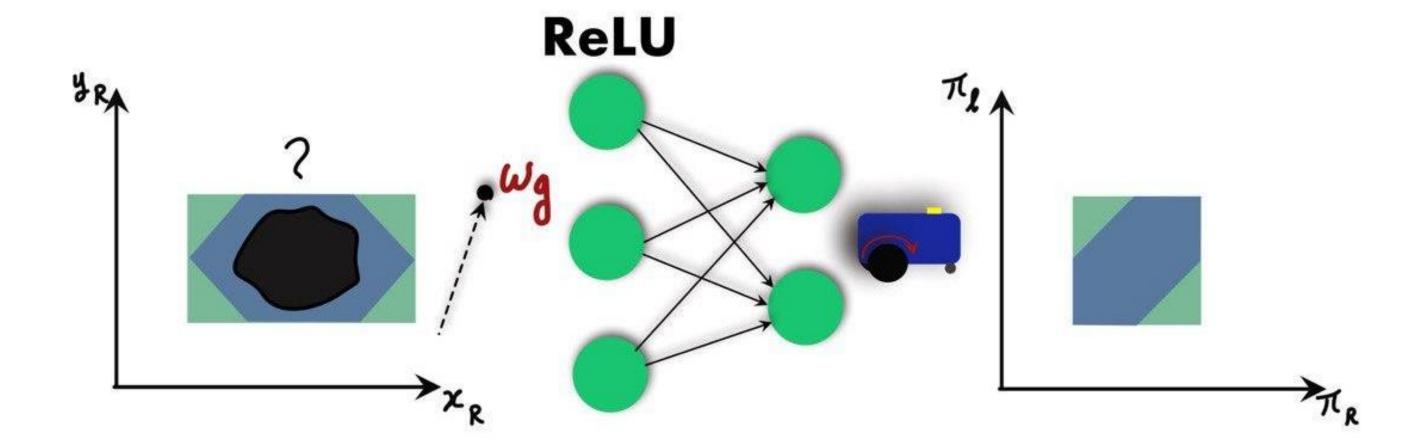
• Inverse models from various skills are used for planning over the hierarchy.





# Using symbolic analysis

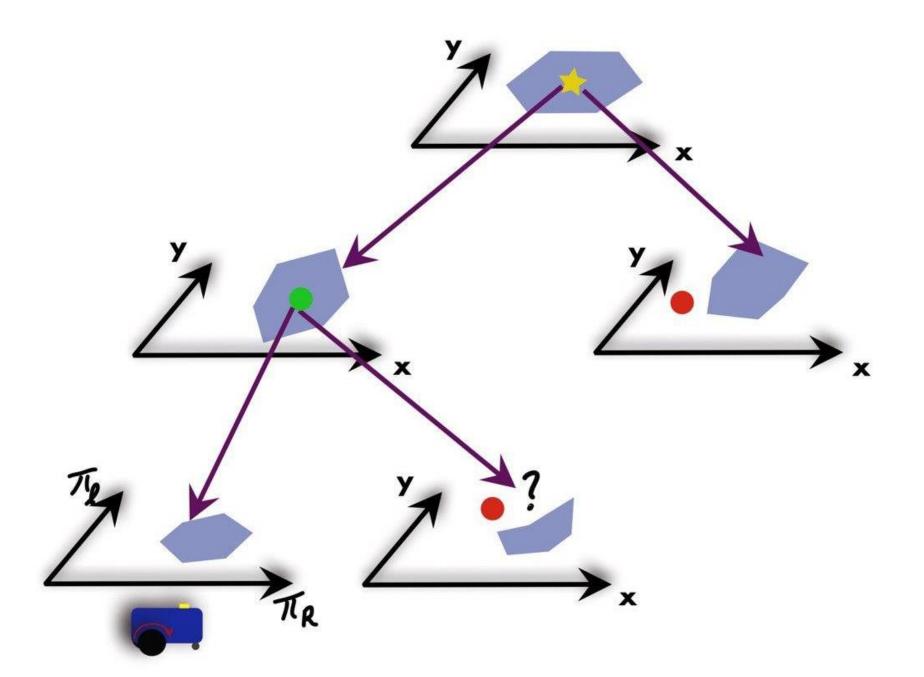
- Current hierarchical learning approaches struggles with data-efficiency as the hierarchy grows (for complex tasks).
- We propose using set-based methods (e.g. abstract interpretation) as a way to reduce the number of training samples.
- Inferring over sets is more efficient than inferring over points in the common sense, but we may need special abstract domains for NN with ReLU activation functions.





# Using symbolic analysis

 New planning is needed for set-based methods as well, in which controllable regions would be the output of the inverse model. This leads to an improved planning over the conventional method.





### Objectives and Challenges

- A life-long learning algorithm, uses symbolic analysis for efficient hierarchical learning.
- Novel abstract domains (for abstract interpretation); exploring the trade-offs between precision and computational cost.
- Novel algorithms for efficient planning in goal oriented hierarchical structures.
- Experiments in simulation, and with real-world robots (mobile robots, manipulators), gradually increasing the complexity of the environment.

