

PartManip

Learning Cross-Category Generalizable **Part Manipulation**
Policy from Point Cloud Observations

CVPR2023

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We humans can successfully manipulate certain types of **parts** across **different objects** in a similar way.



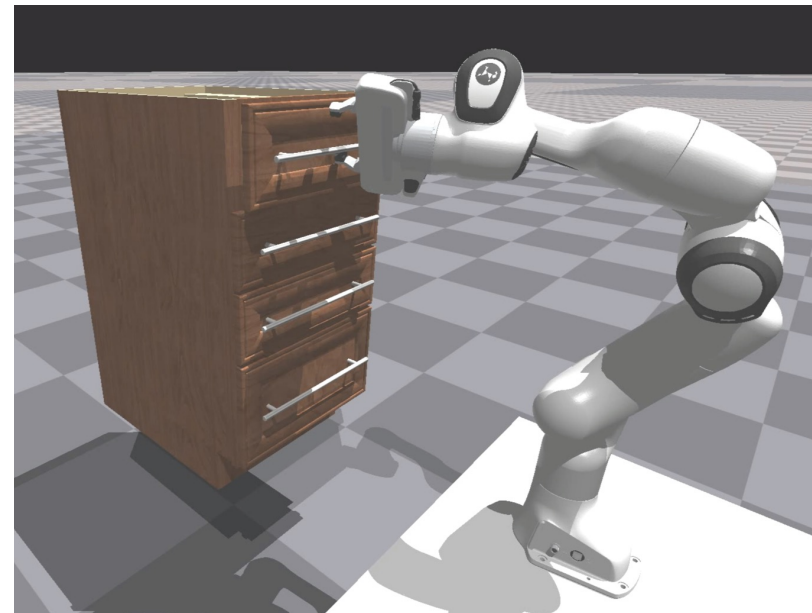
Pressing Buttons on Microwave



Opening Drawer on Table



In this work, we tackle **generalizable part-based** manipulation policy learning.



open drawer in simulator



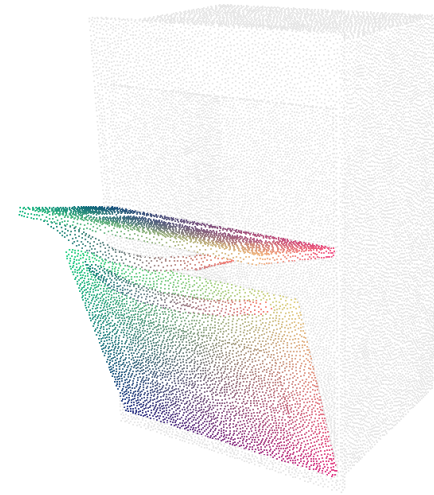
open drawer in real world

Problem Setting

1. Realistic robotic setting

2. Cross-category generalization

Previous works

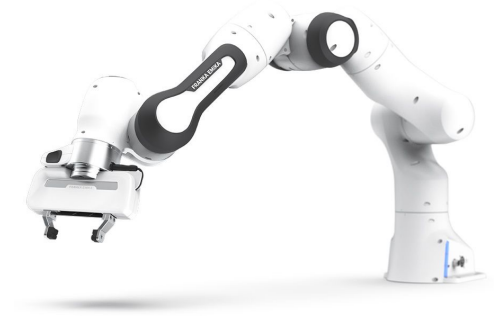
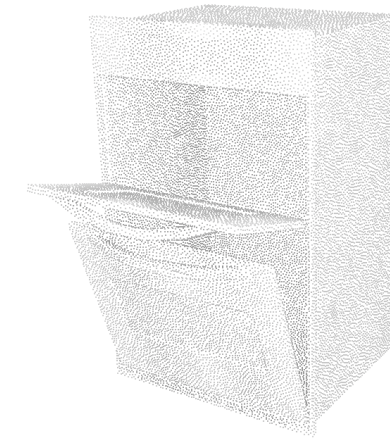


Take inputs **oracle**
object states
e.g. part mask, handle mask



Objects from **single** category

Ours



Realistic inputs,
Depth Point cloud + Robot
proprioception



Objects from **multi-categories** and
generalizes to **unseen categories**

Our Benchmark

494 objects borrowed
from GPartNet¹
11 object categories



Table



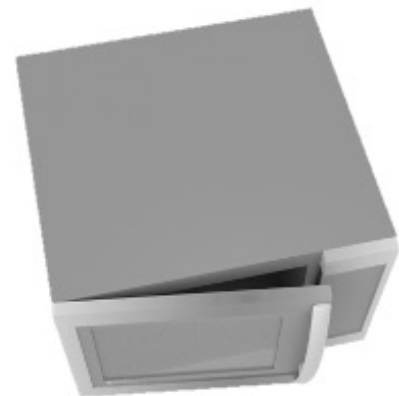
Remote



Oven



Dishwasher



Microwave



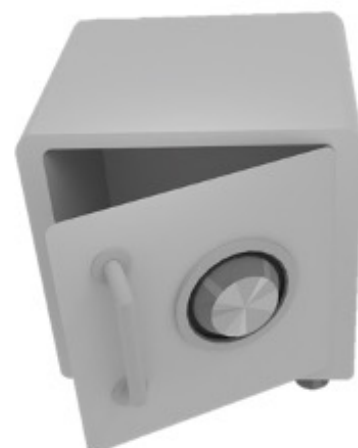
TrashCan



storage furniture



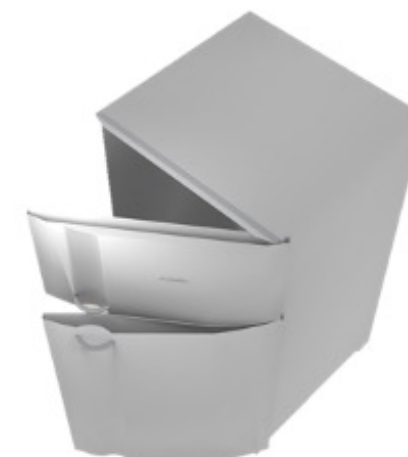
Washing machine



Safe



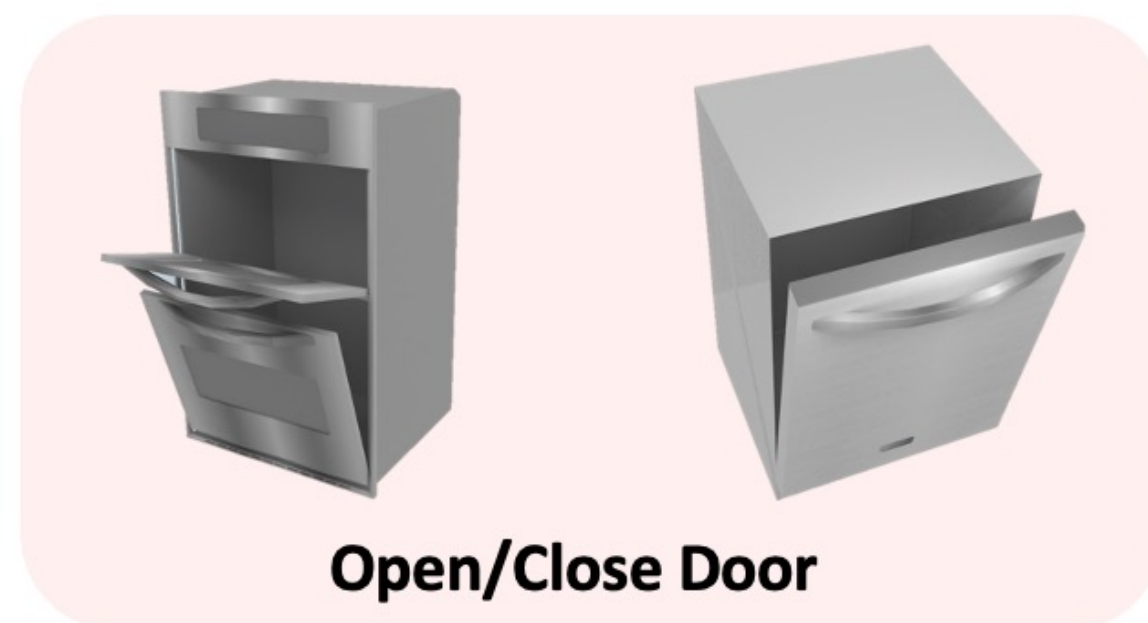
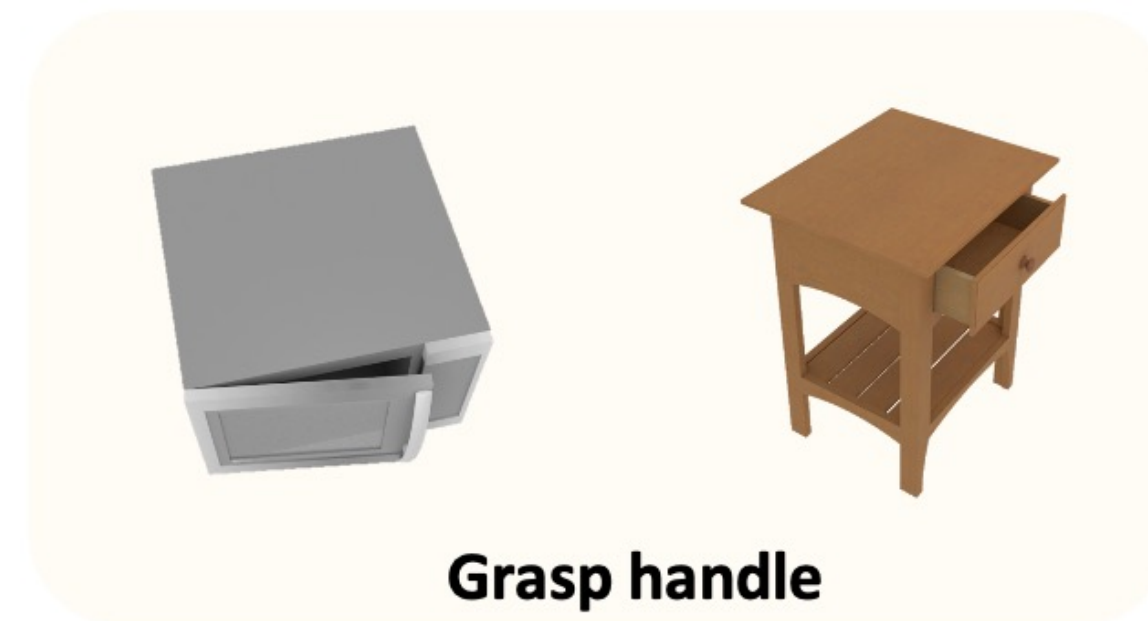
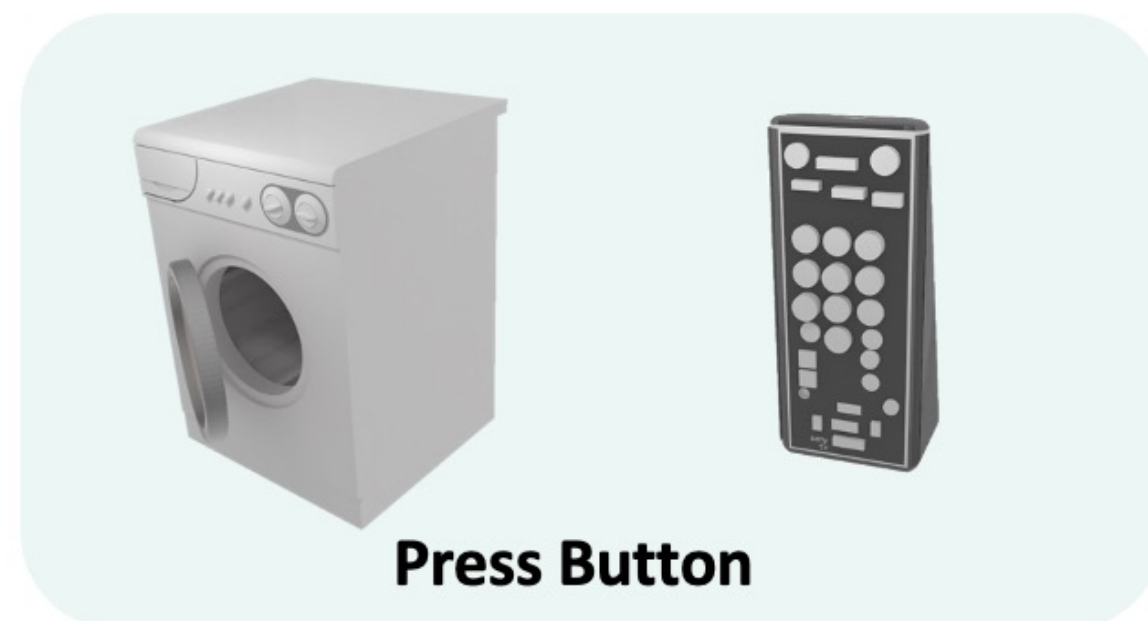
Phone



Refrigerator

Our Benchmark

494 objects
11 object categories



→ Six tasks

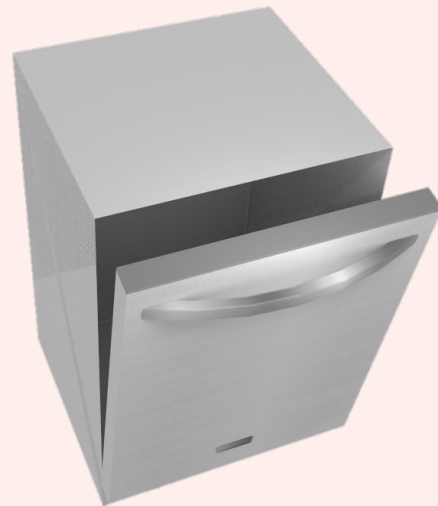
1432 different parts

Task Example: Opening Doors

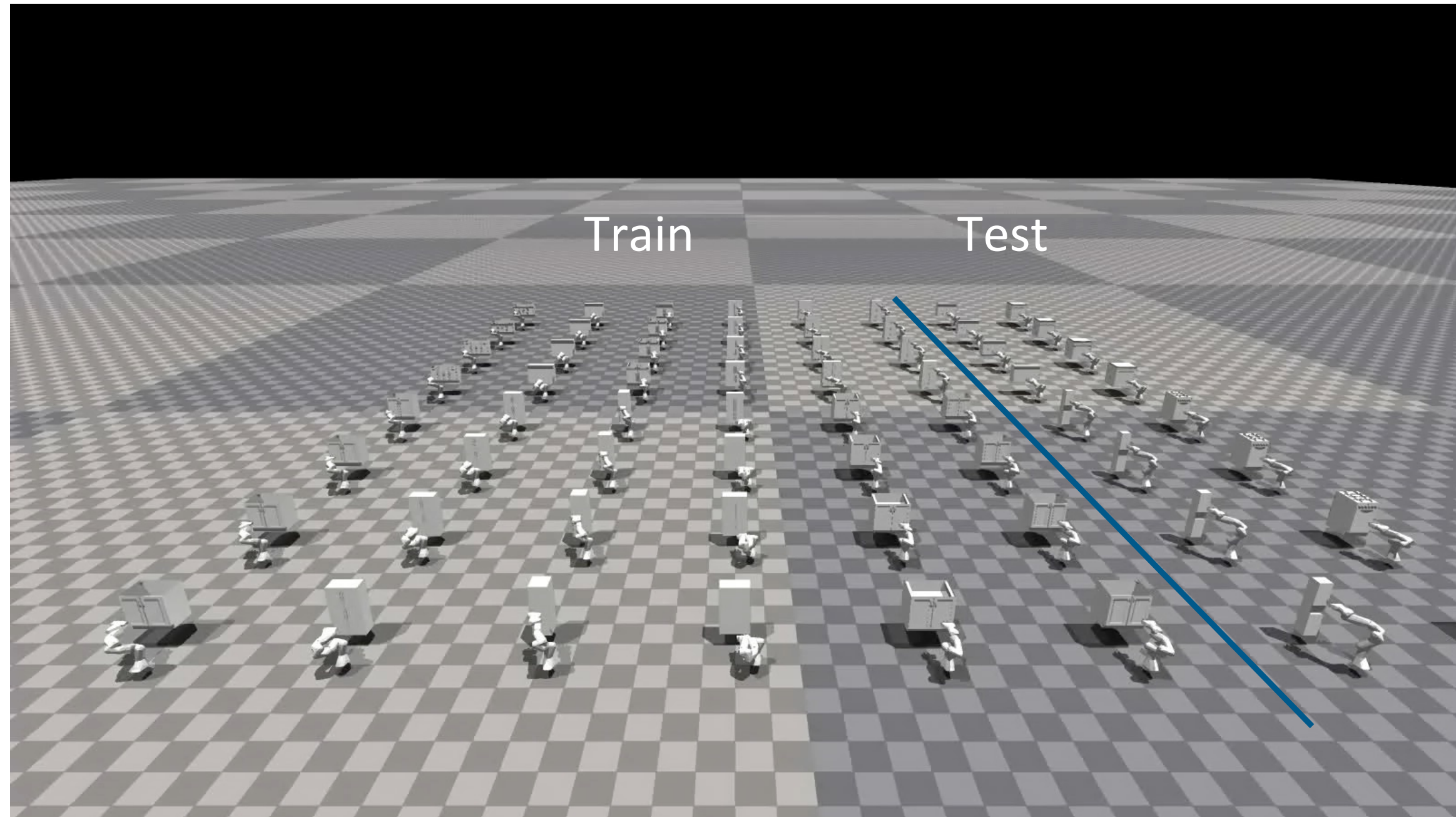
363 Training Doors

63 unseen doors in seen categories

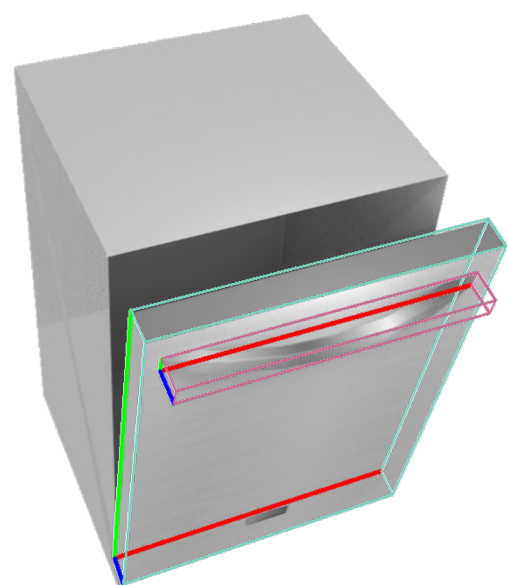
77 unseen doors in unseen categories



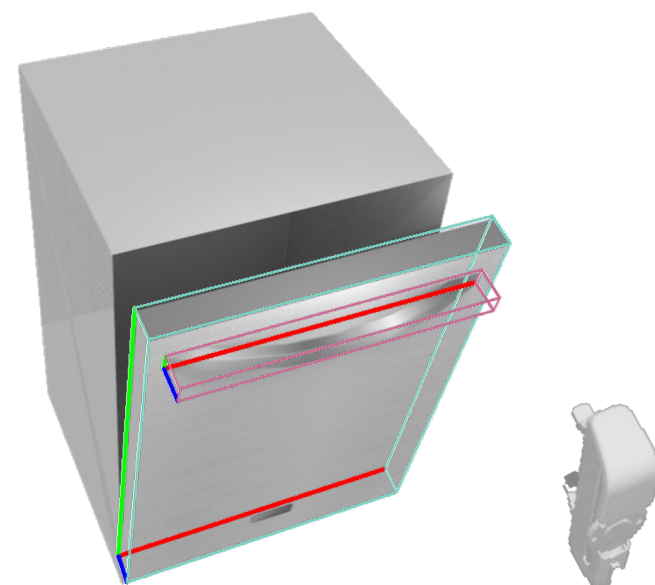
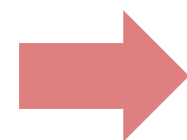
Open Door



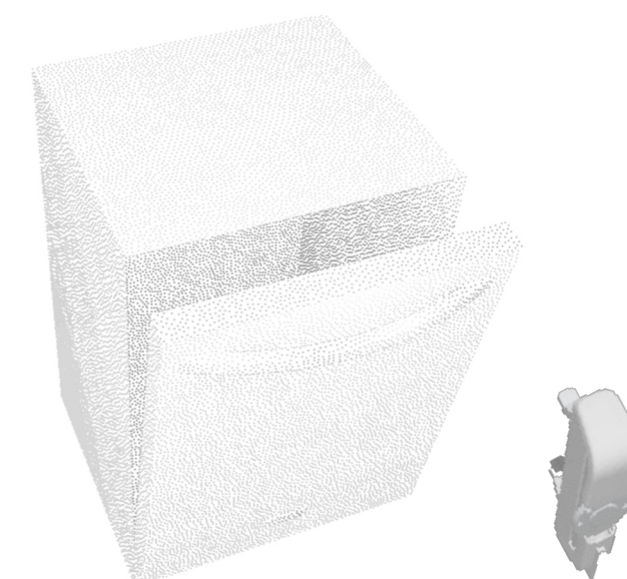
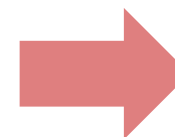
Method Overview



Part-Aware Reward

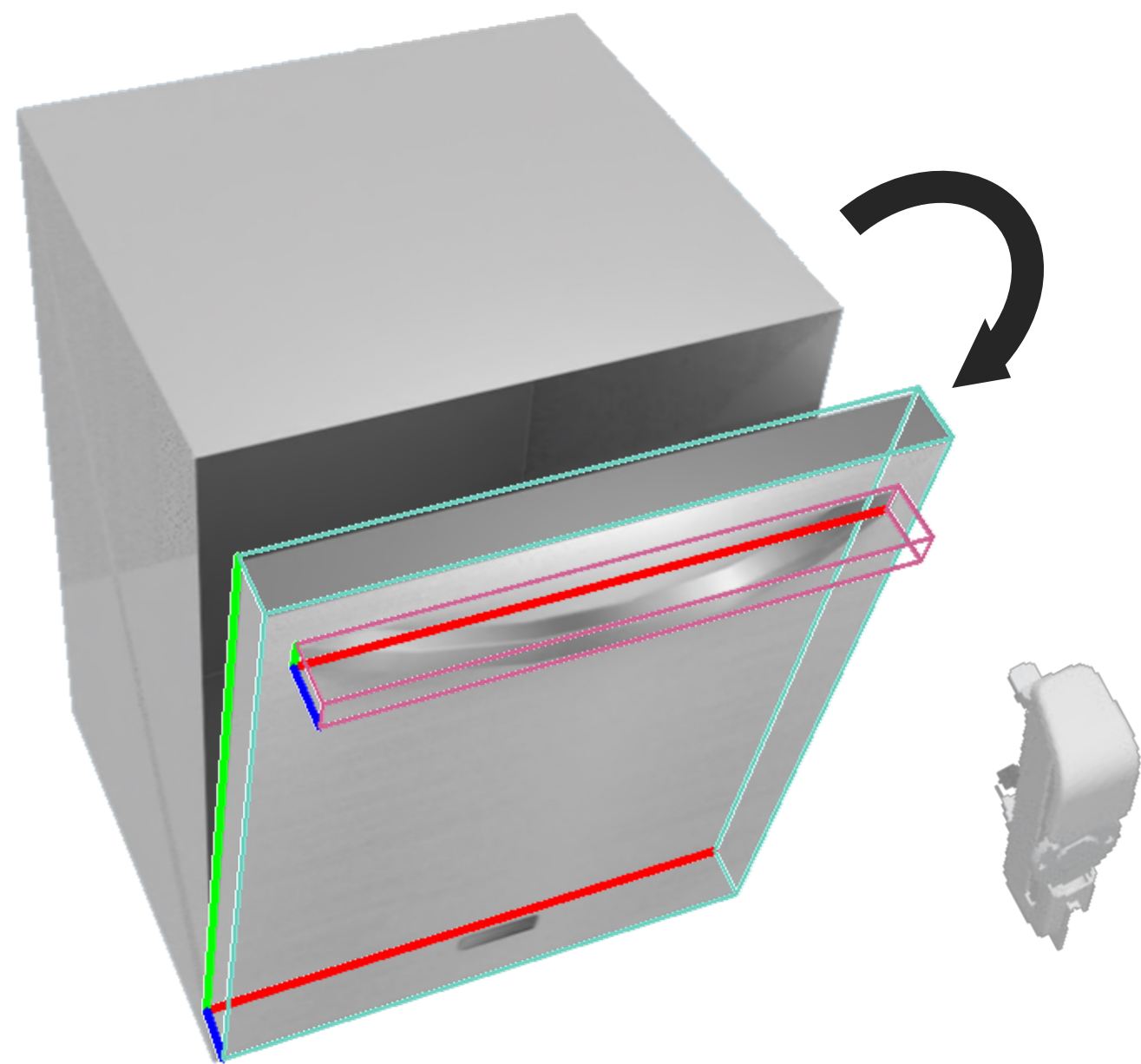


State-based Expert Policy



Vision-based Student Policy

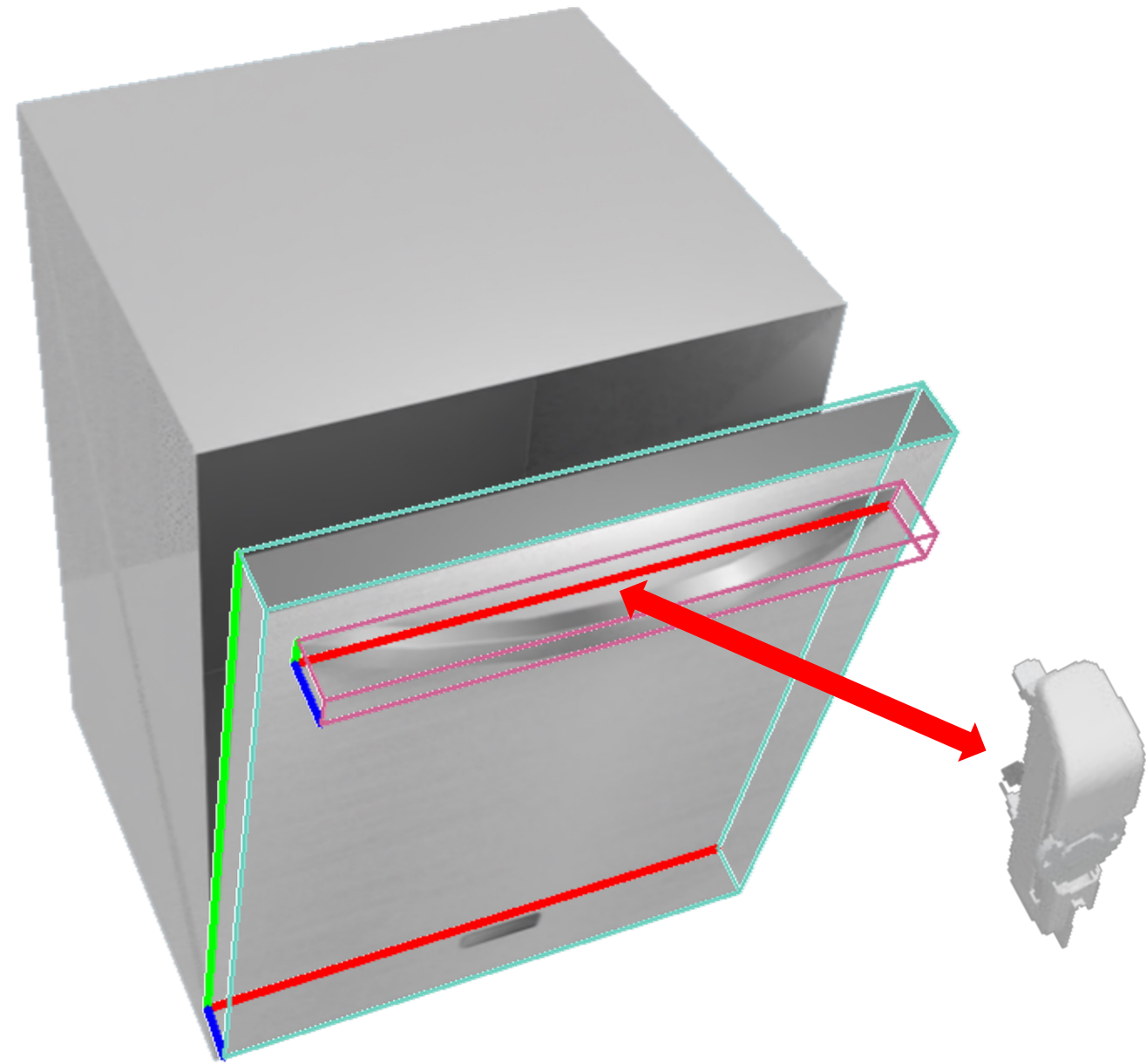
Part-Aware Reward



Part Moving Reward:

Moving distance of rotations of the target part

Part-Aware Reward



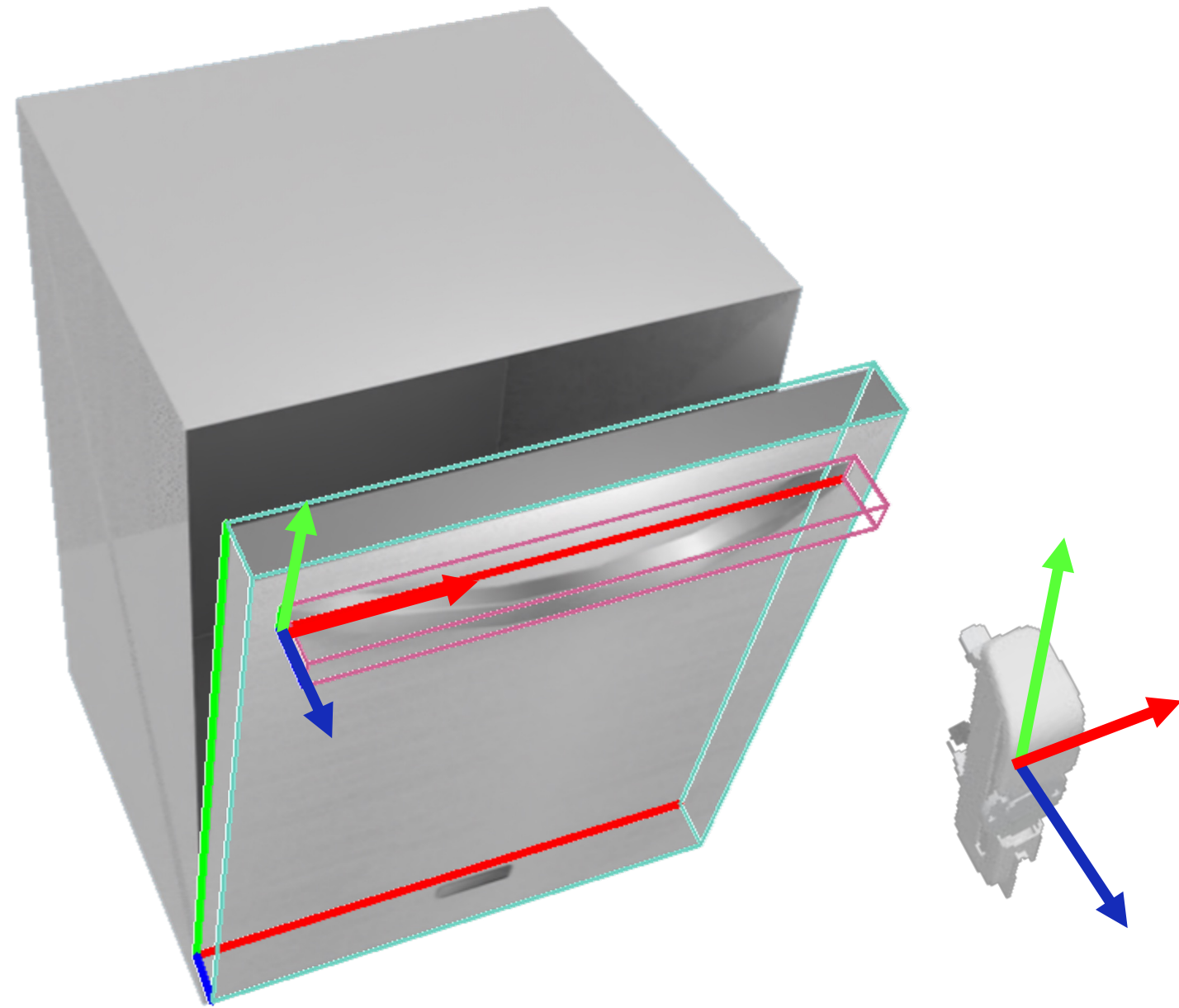
Part Moving Reward:

Moving distance of rotations of the target part

Handle Distance Reward:

the negative value of the distance from the handle center to the center of the tips.

Part-Aware Reward



Part Moving Reward:

Moving distance of rotations of the target part

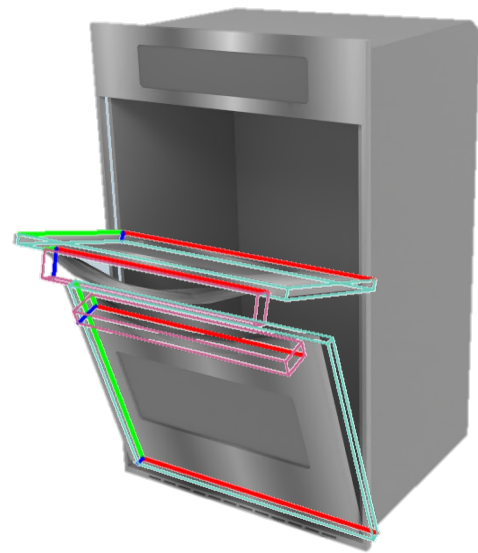
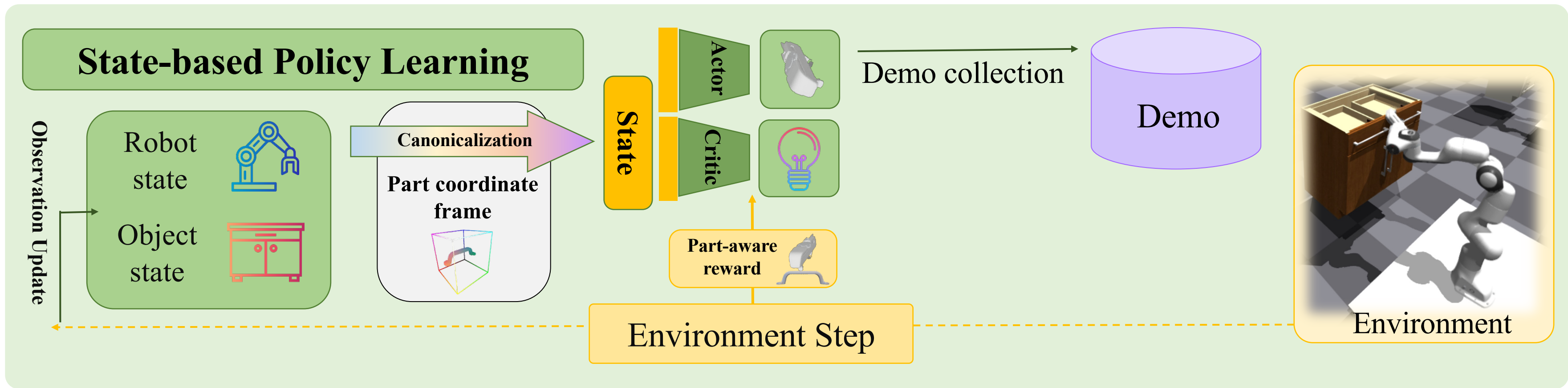
Handle Distance Reward:

the negative value of the distance from the handle center to the center of the tips.

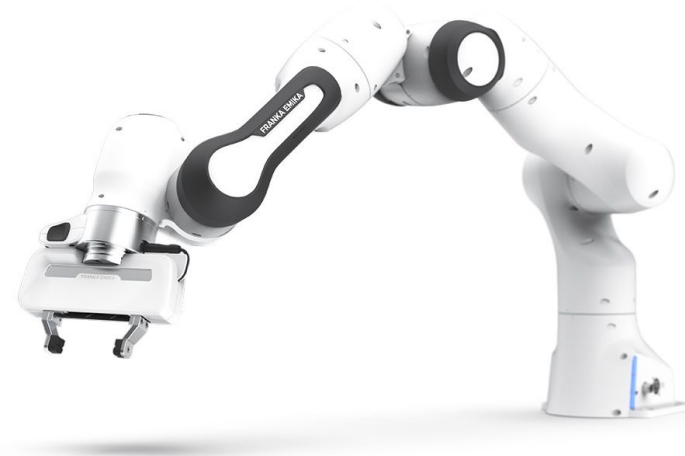
Rotation Reward:

the dot production of three axes of gripper and handle

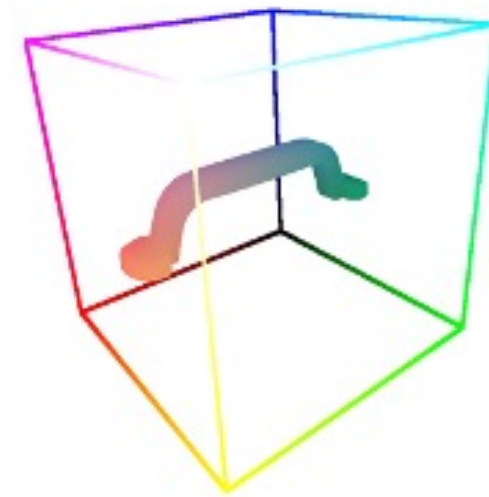
State-based Policy Training



Part Bounding Box
Handle Bounding Box

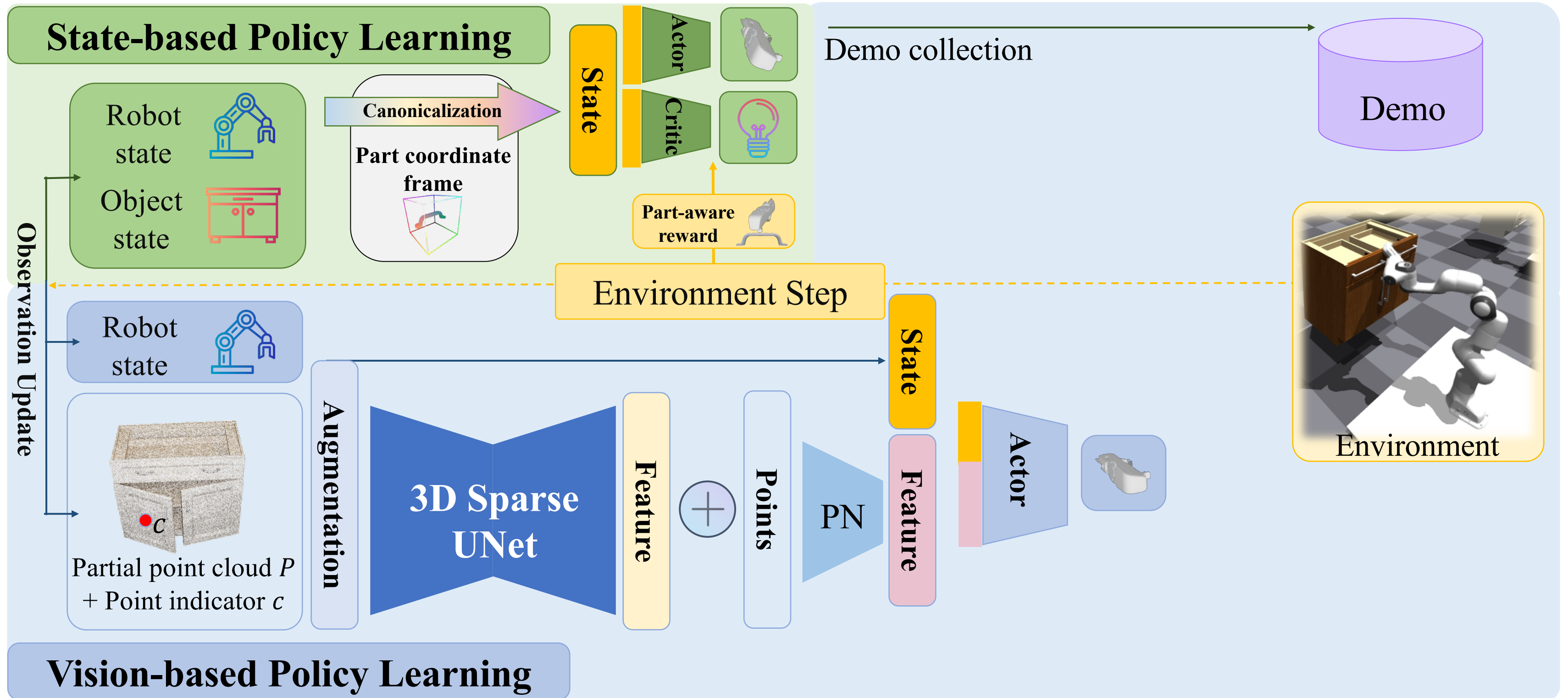


Robot arm joint angle

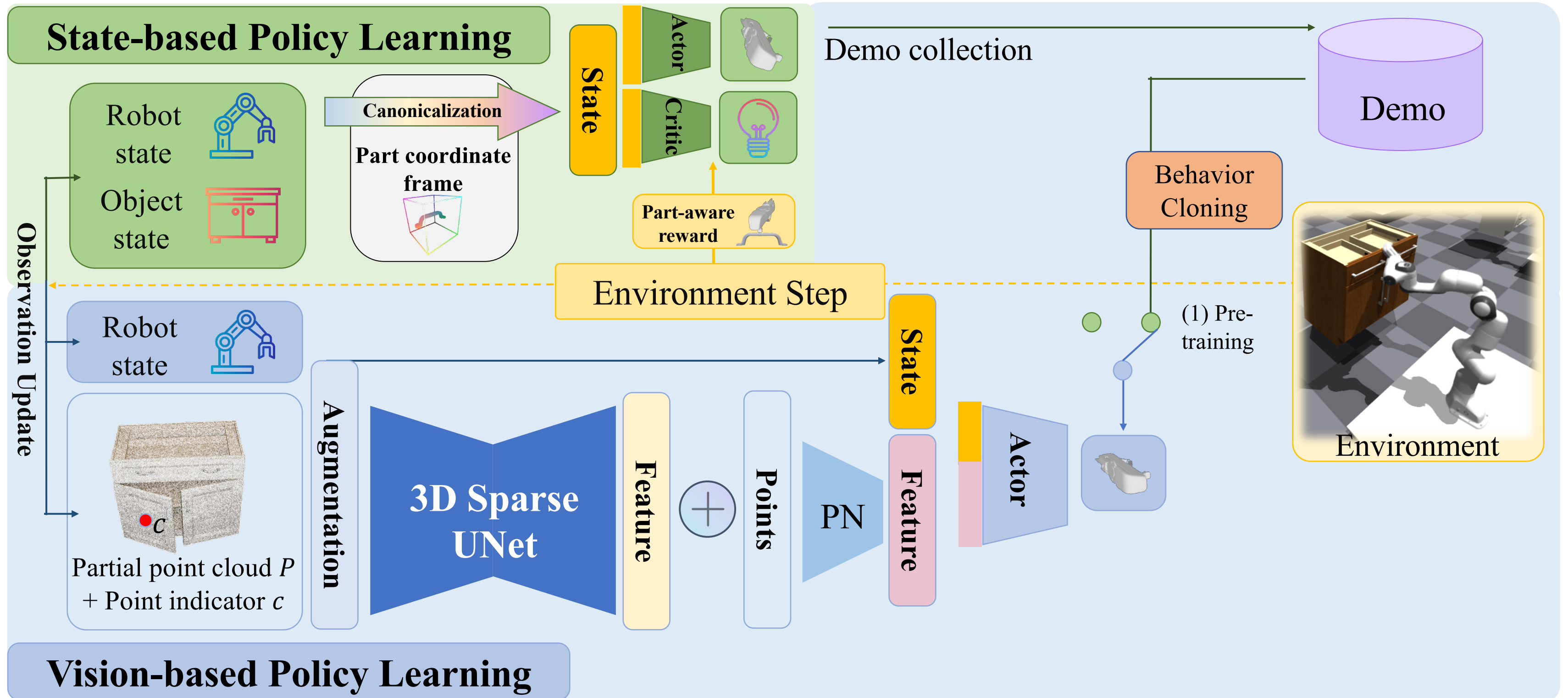


Canonical space of the handle

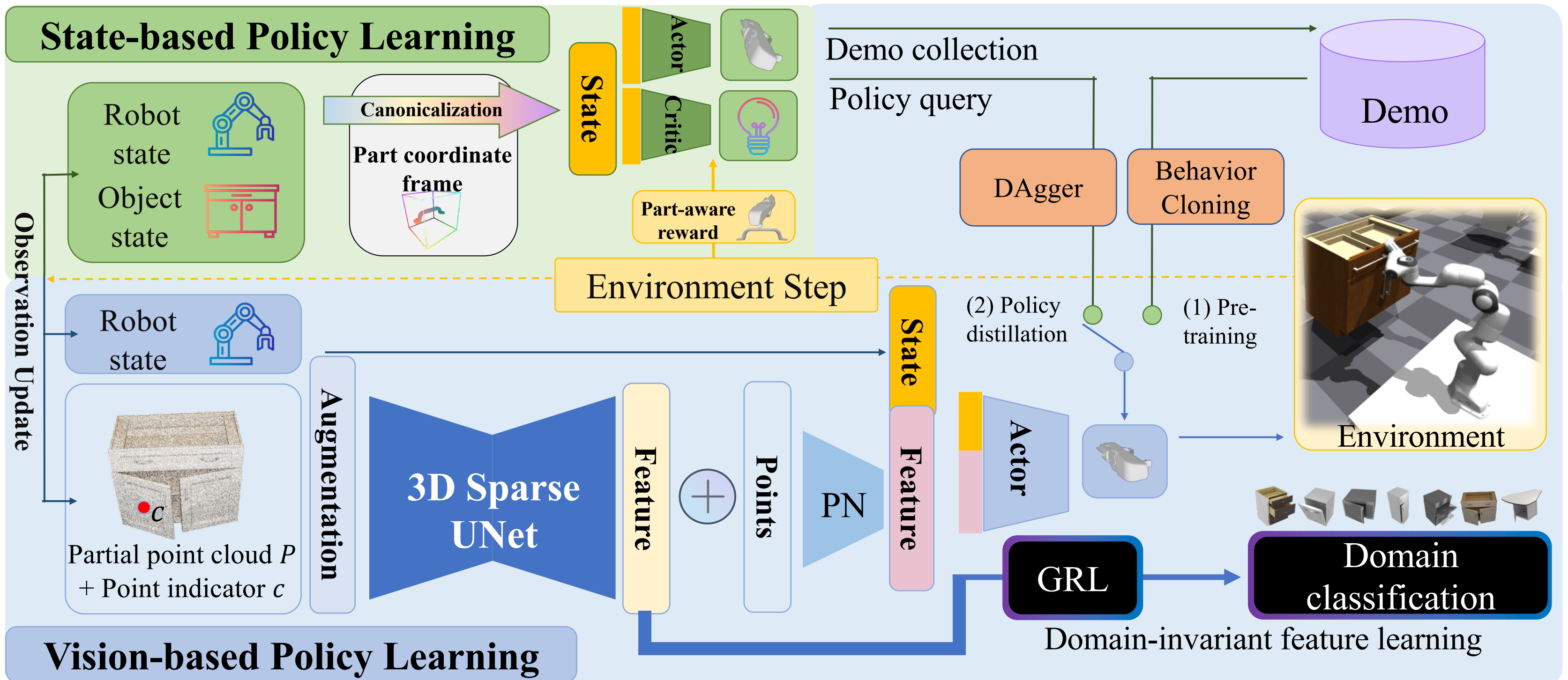
Vision-based Policy Training



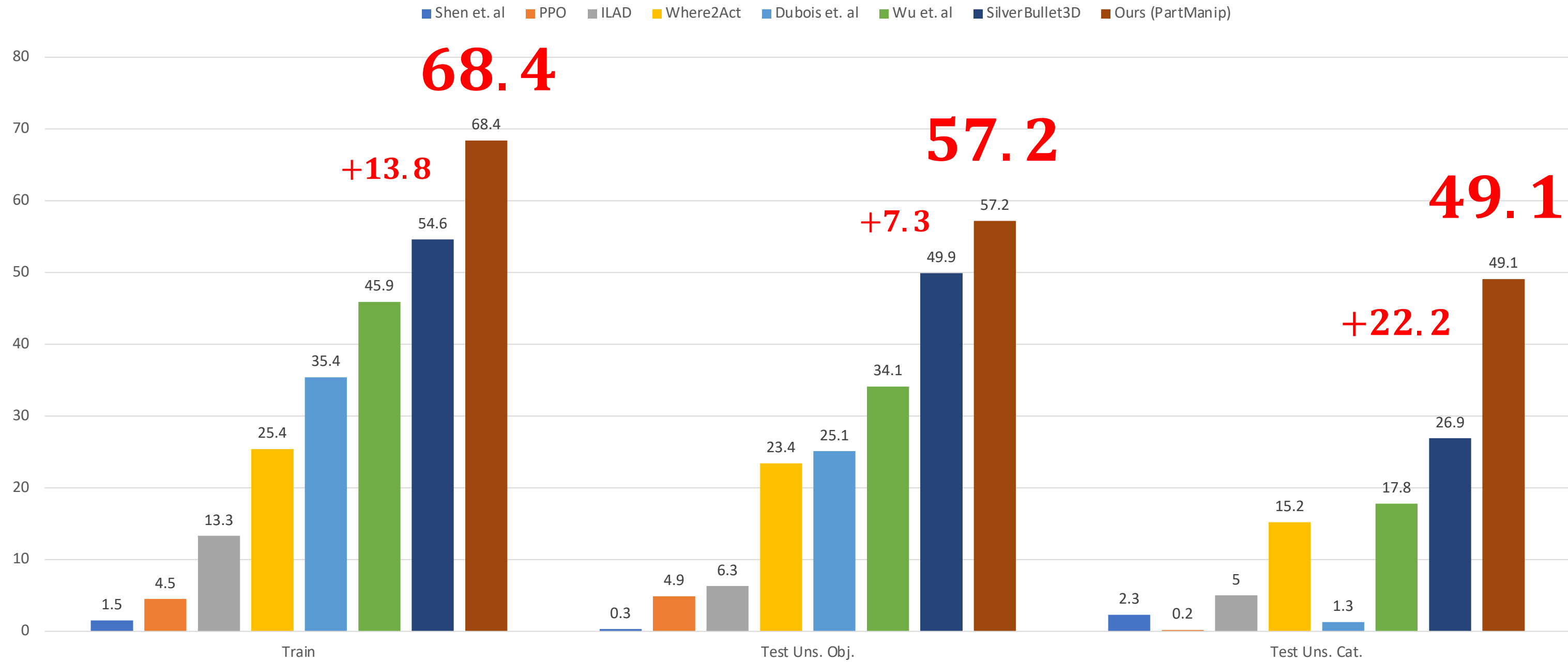
Vision-based Policy Training



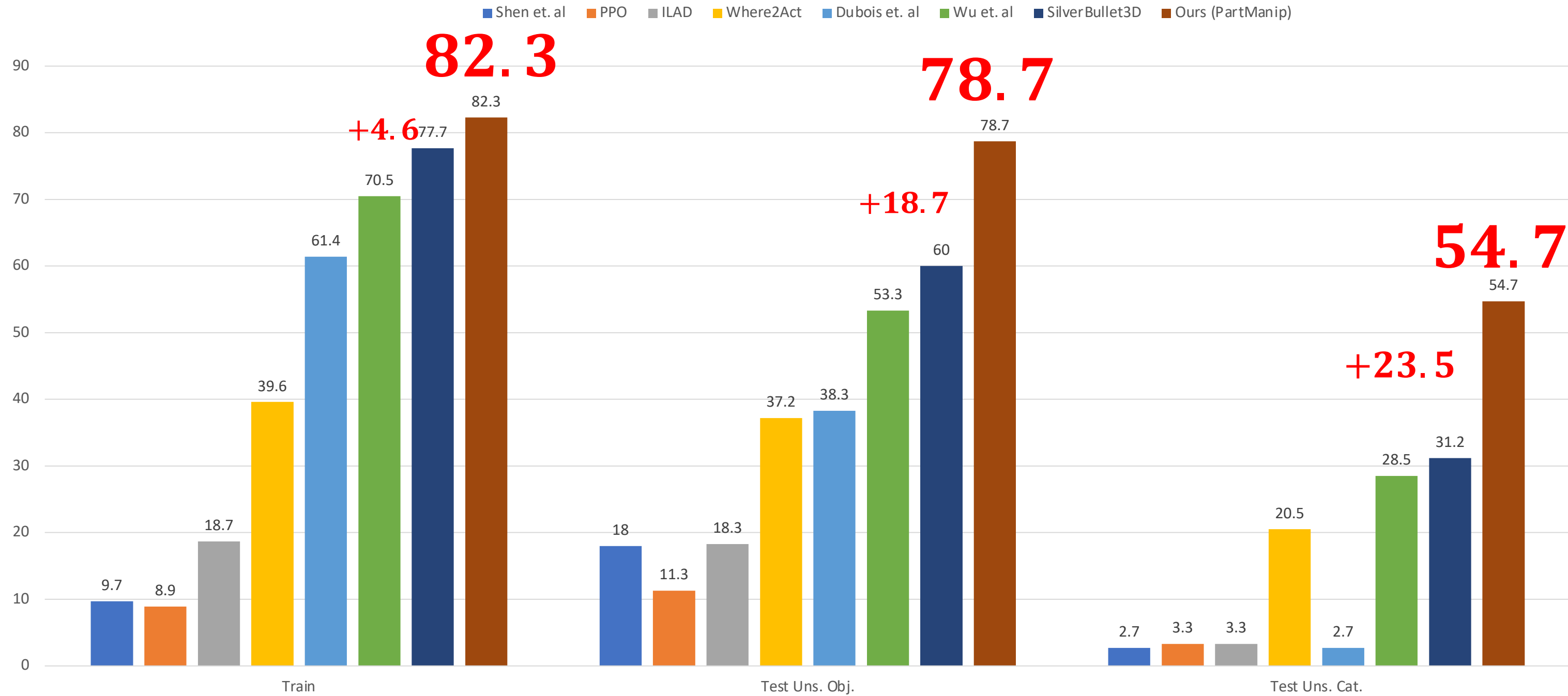
Vision-based Policy Training



Results of Opening Door



Results of Opening Drawer

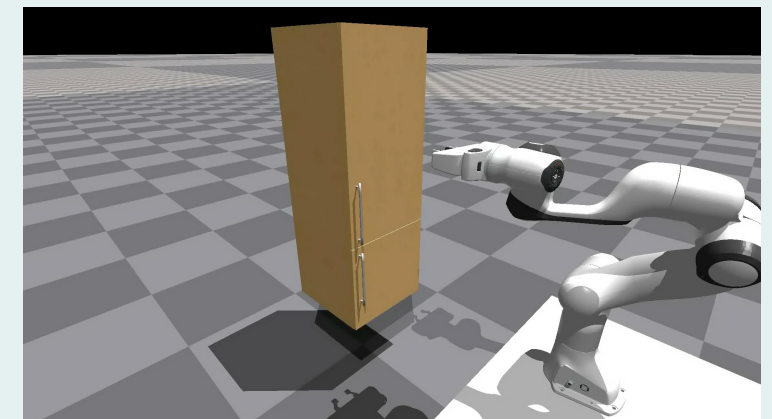
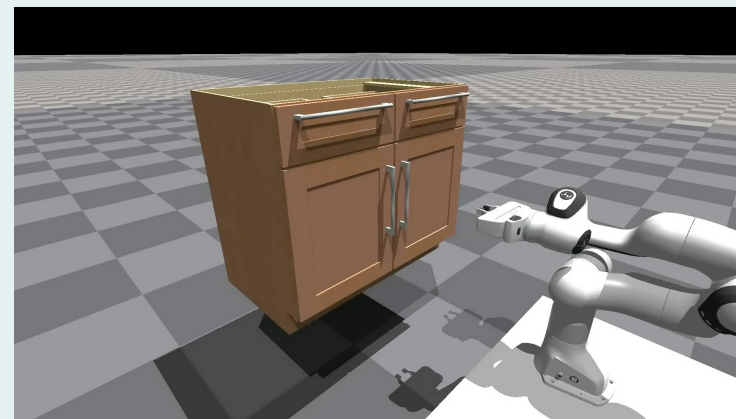
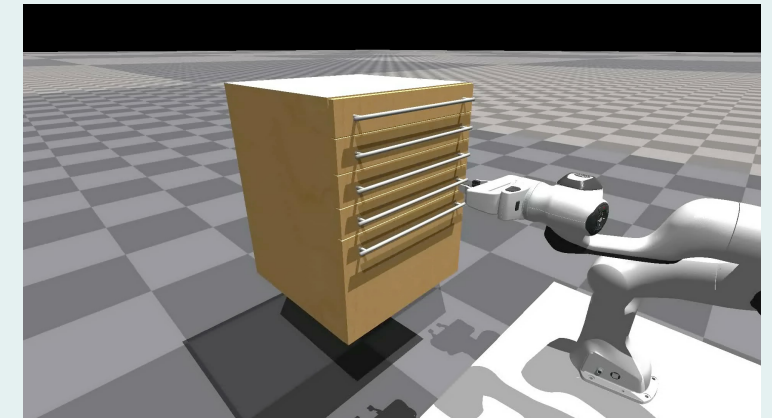
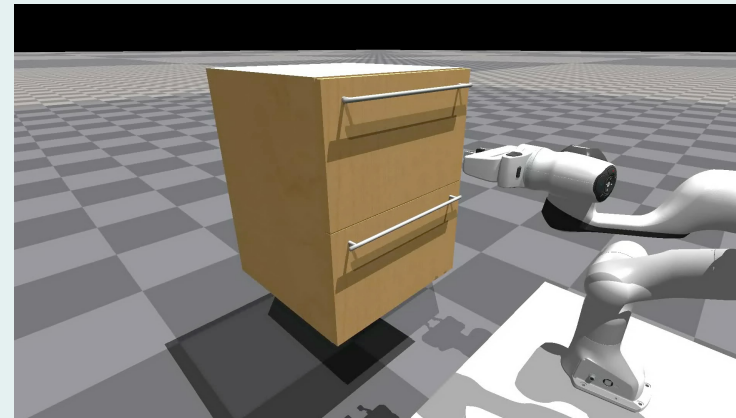


Training Results

GAIL based Approach¹

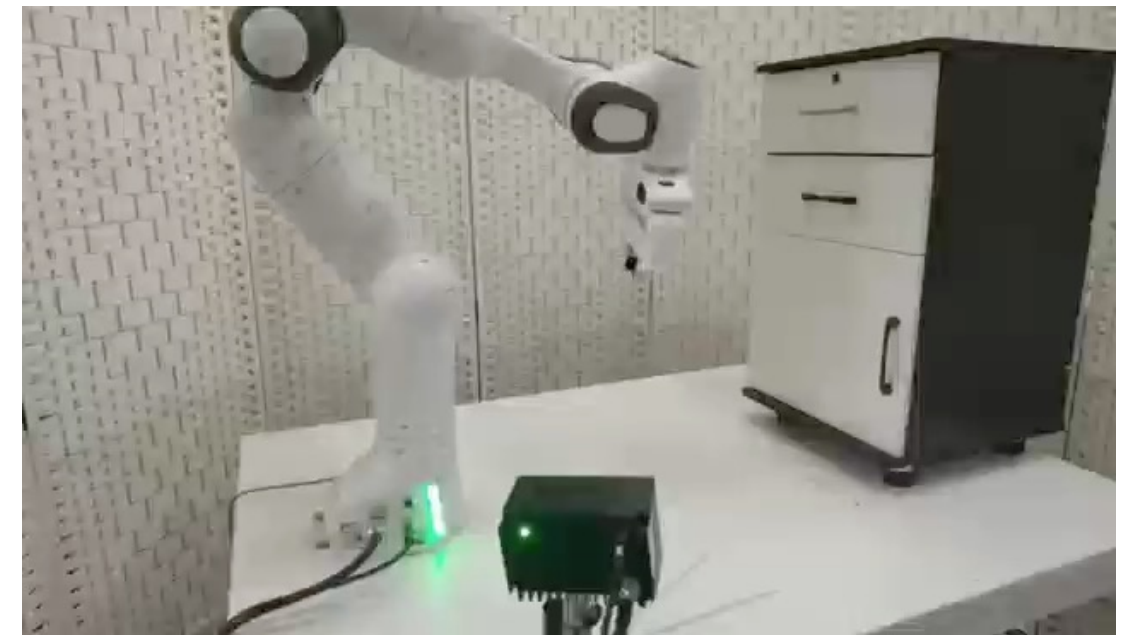
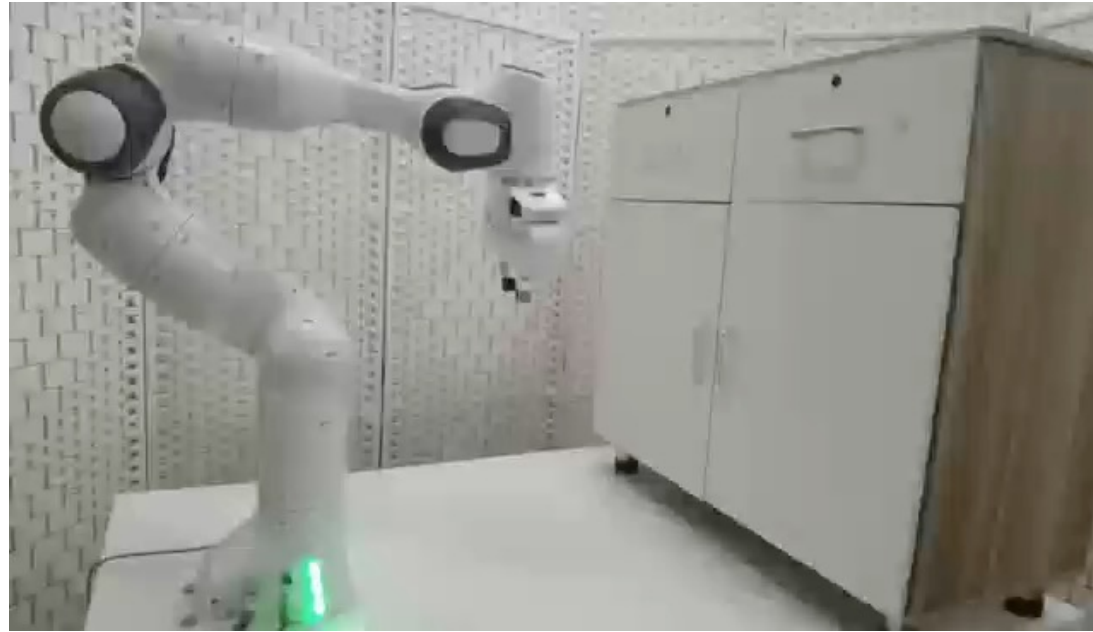


Ours



Real-World Experiment

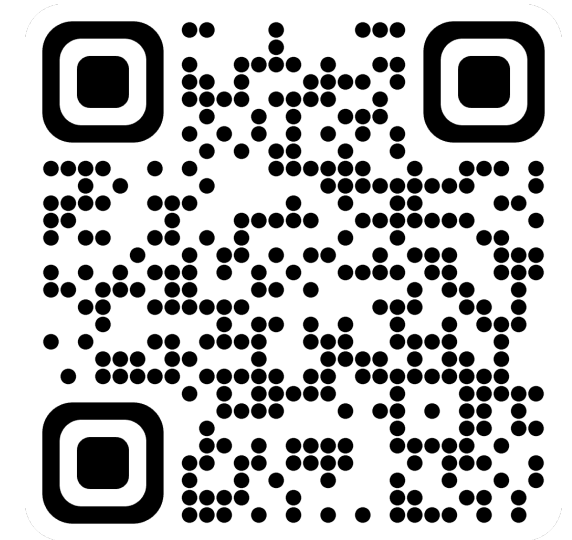
Open doors and drawers
in the real world



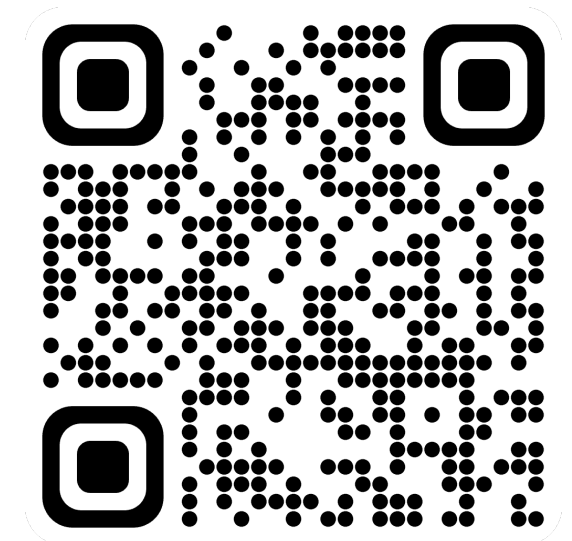
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Thanks for watching!



Project



Code