

# CAREER: Self-supervised Representation Learning for Deformable Object Manipulation

Poster 20

NSF IIS: Div Of Information & Intelligent Systems

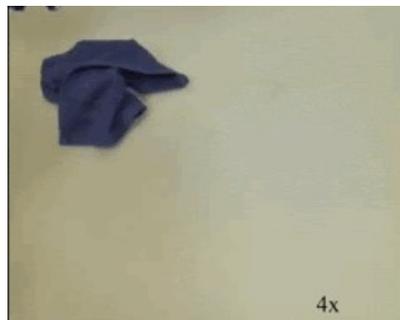
Award # 2046491 / March 15, 2021 / David Held, Carnegie Mellon University

## Challenge

- How can robots learn to represent deformable objects to enable manipulation tasks?

## Solutions

- Mesh-based dynamics model for cloth smoothing
- Flow-based policy for cloth folding
- Self-supervised image translation for water segmentation



(CoRL 2021)



(CoRL 2021)

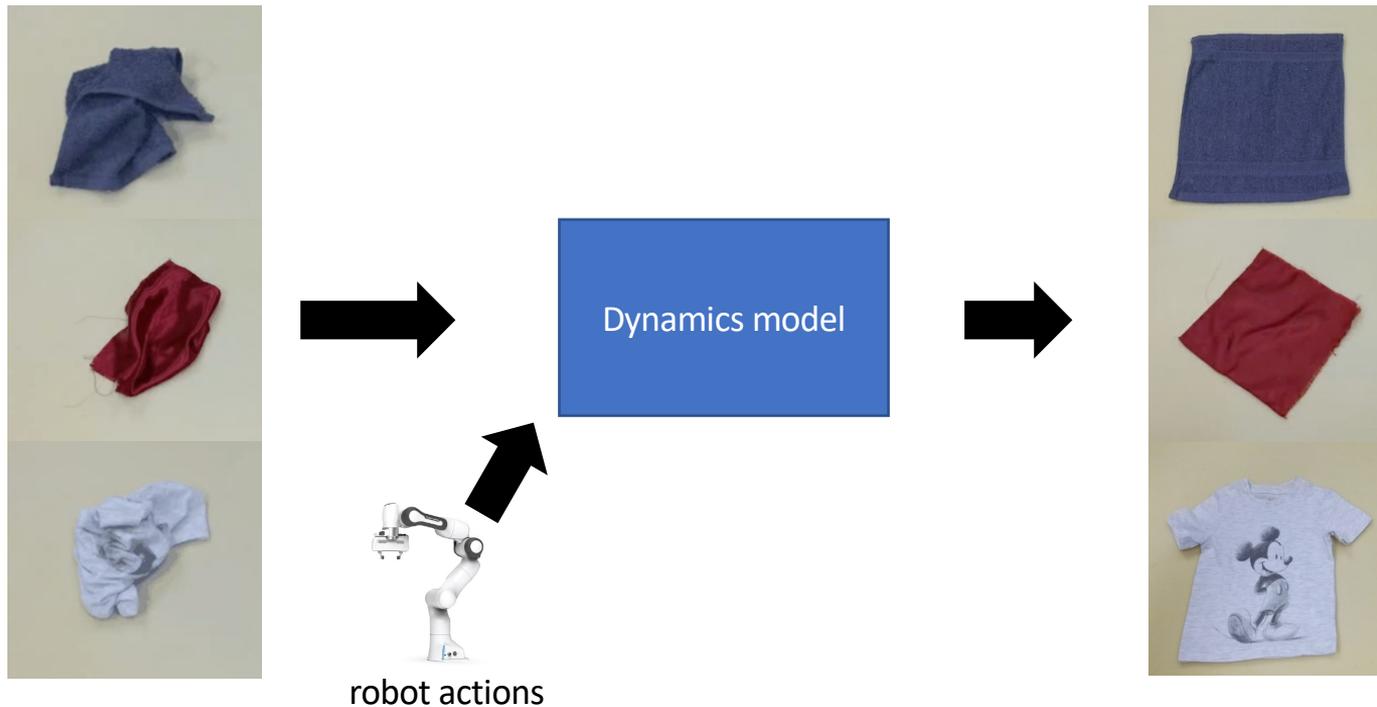


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## Broader Impacts

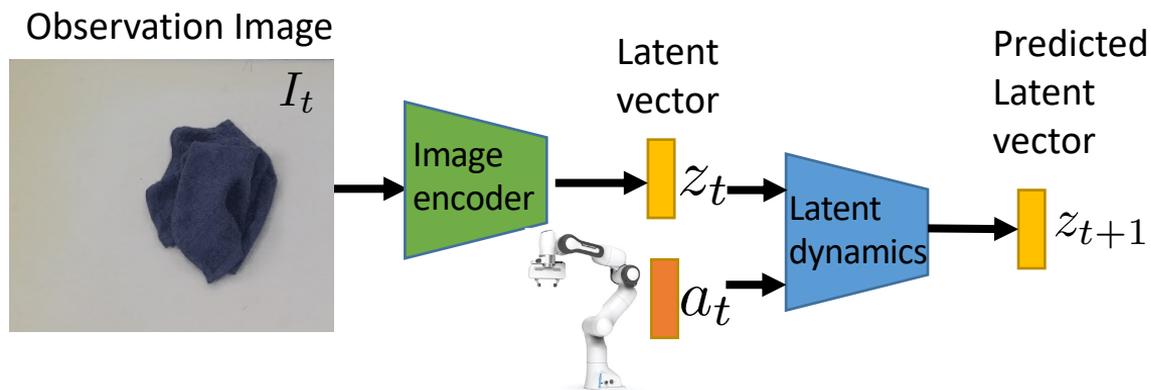
- Robot housekeeper
- Assistive dressing / feeding
- Tools for robots to manipulate deformable objects

# How can we learn a dynamics model for cloth?



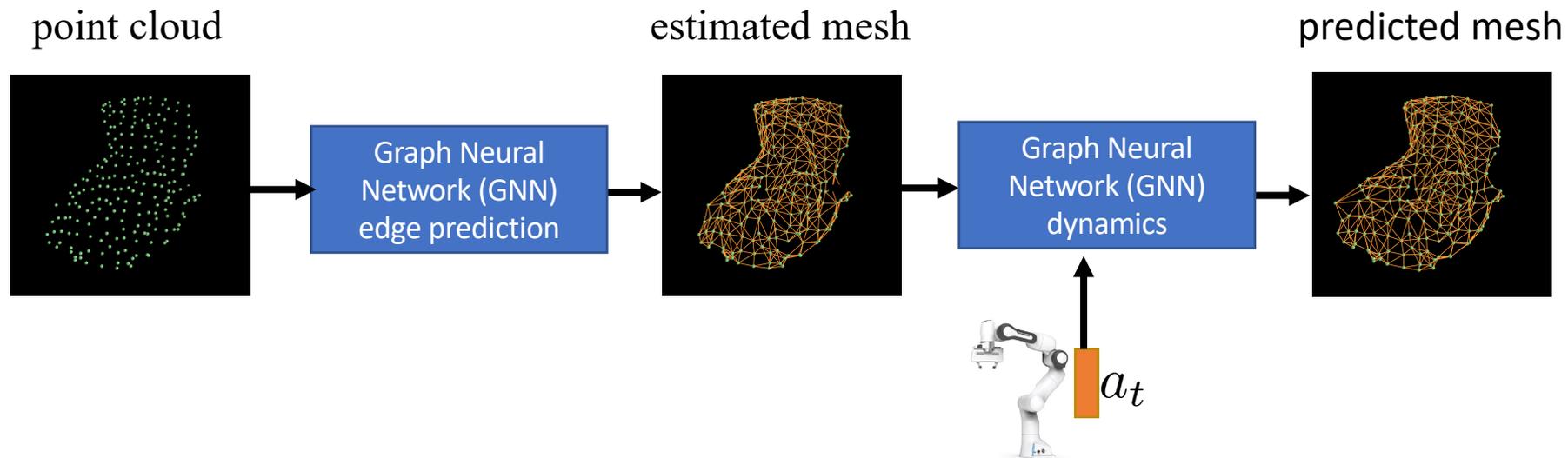
# Approach 1: Learn a latent vector dynamics model

[Hafner, et al 2019, Yan et al. 2020]



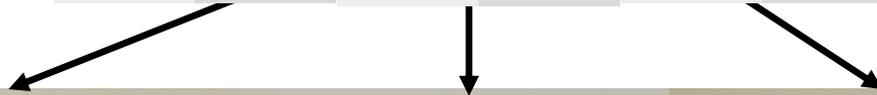
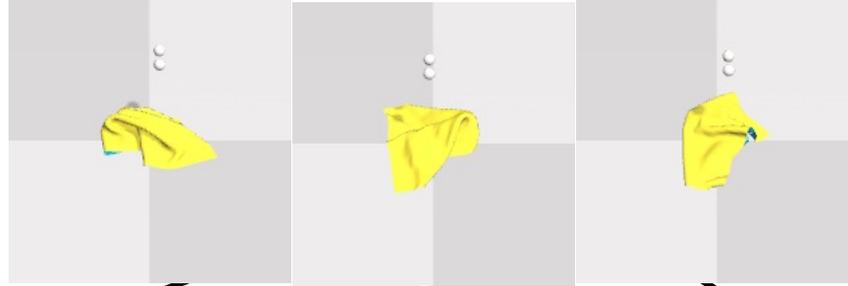
**Lacks environmental structure, making generalization difficult**

# Our approach: Learn a mesh dynamics model



# One mesh dynamics model (one set of weights)

Training:



Evaluation:



cotton square

silk square

cotton t-shirt

# Cloth smoothing with a Franka arm

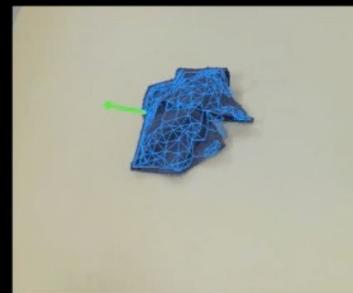
Cotton square cloth



Franka execution

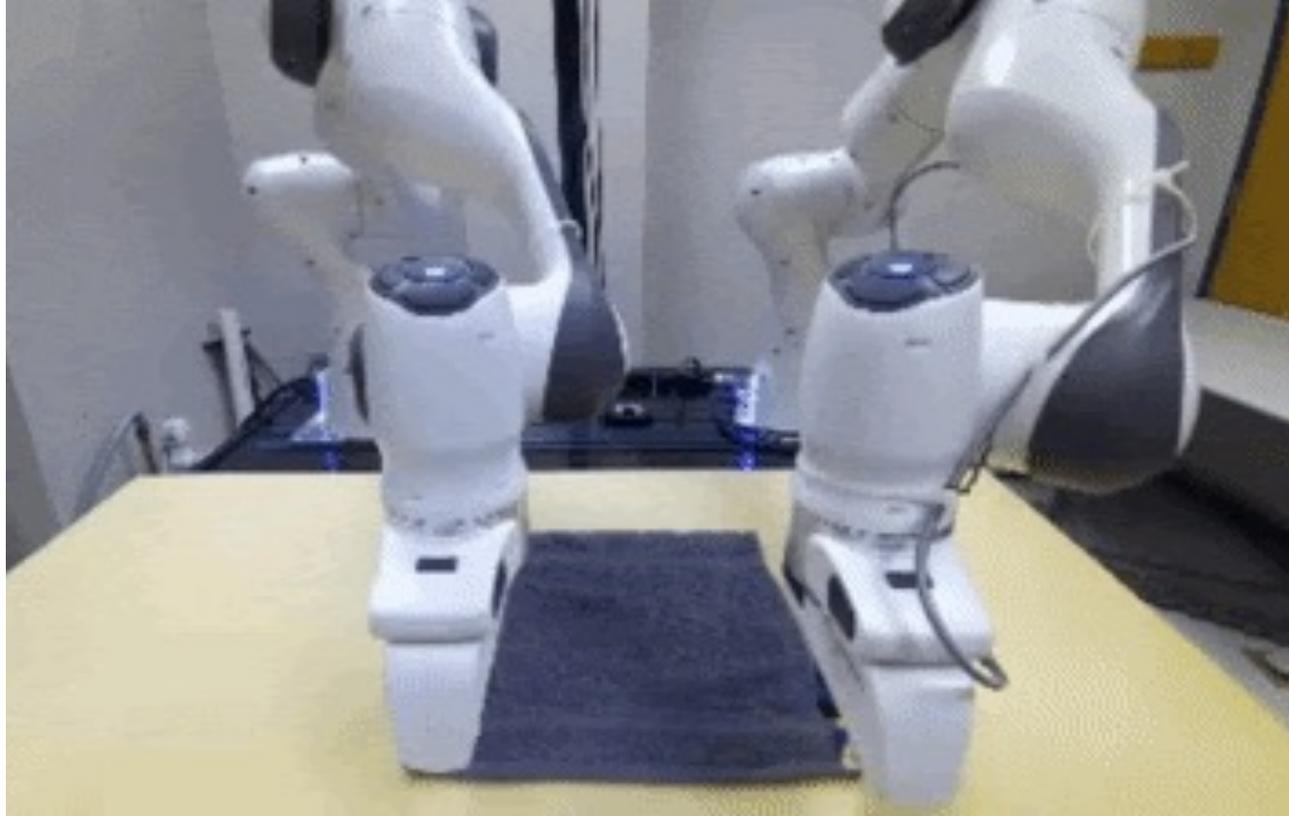


Scores of sampled actions  
(greener is higher)

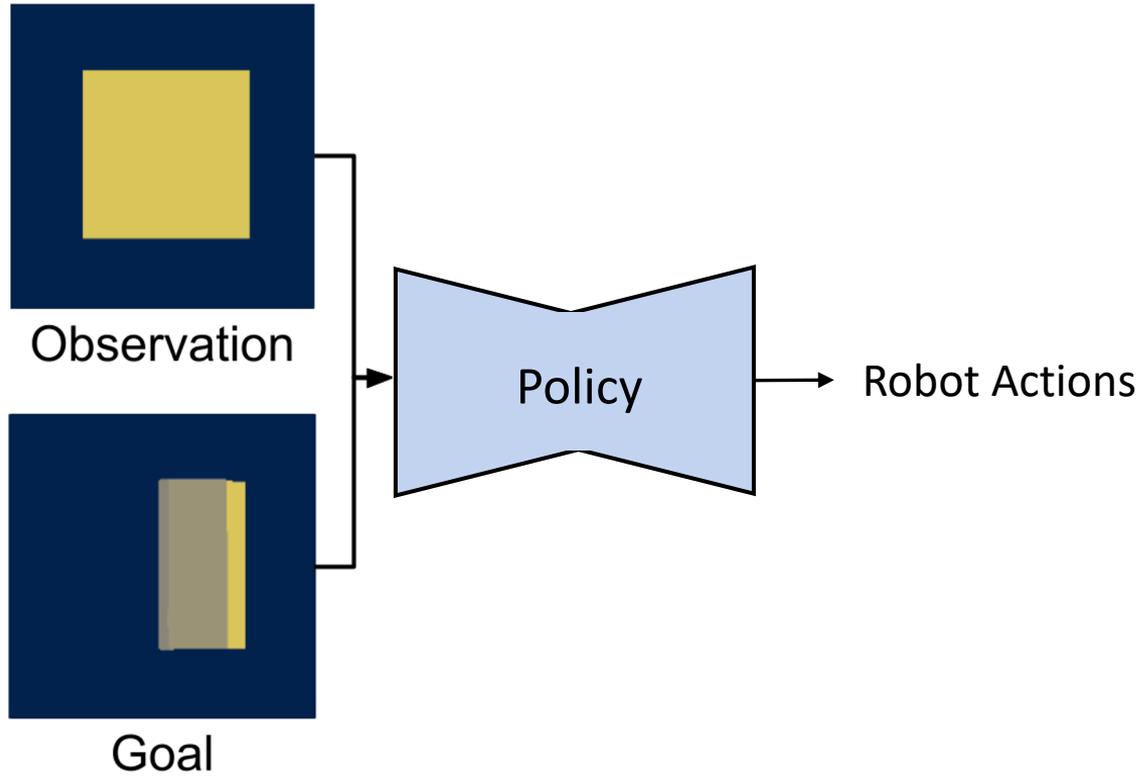


VCD prediction

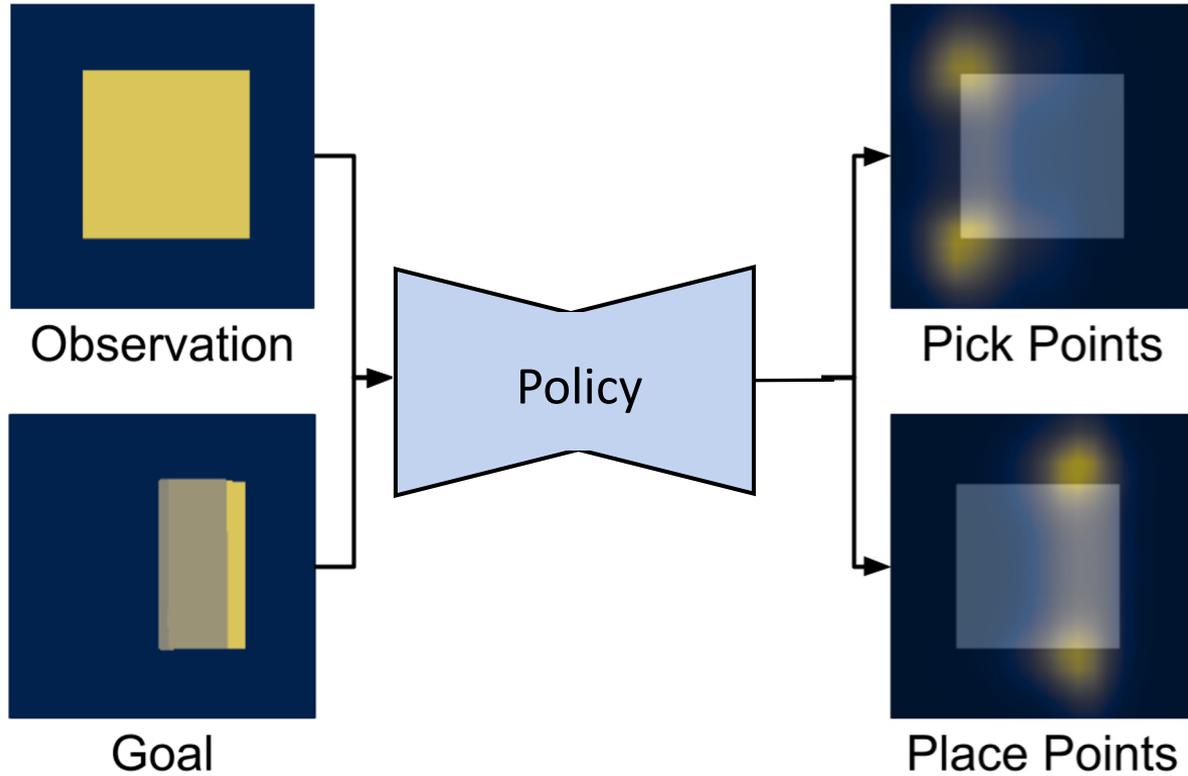
# Flow-based Policy for Bimanual Goal-conditioned Cloth Flattening



# Previous Work:

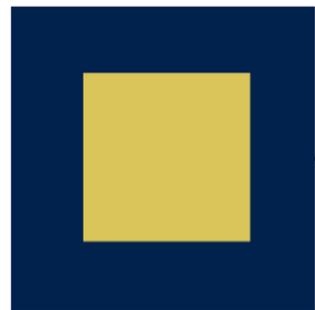


# Previous Work:

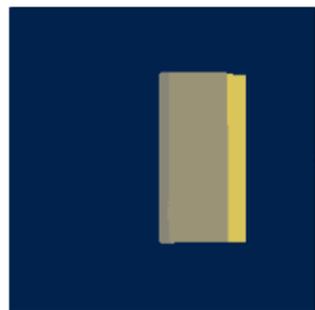


# Our Main Insight:

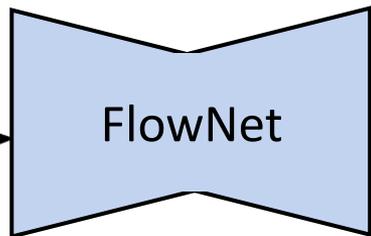
First infer desired  
**object** motion



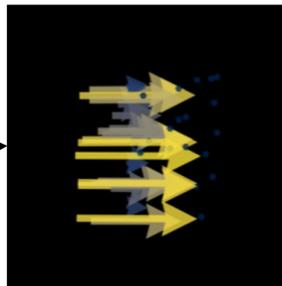
Observation



Goal



FlowNet



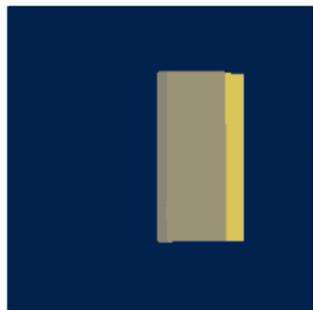
Desired cloth motion

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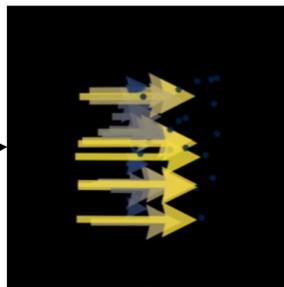
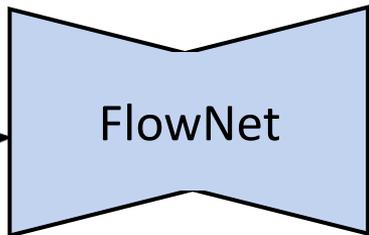
First infer desired **object** motion



Observation

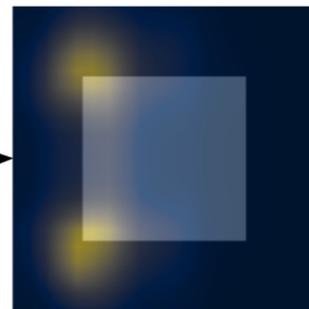
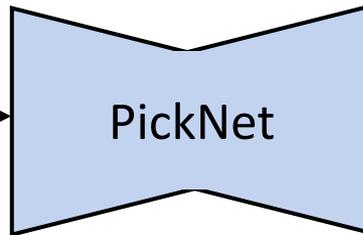


Goal

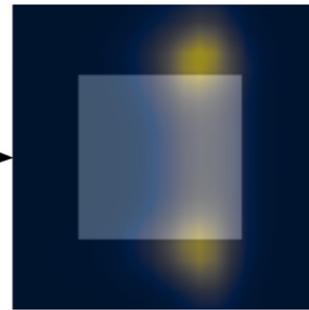


Desired cloth motion

...then infer desired **robot** actions



Pick Points



Place Points

# Real folding videos



4x speed

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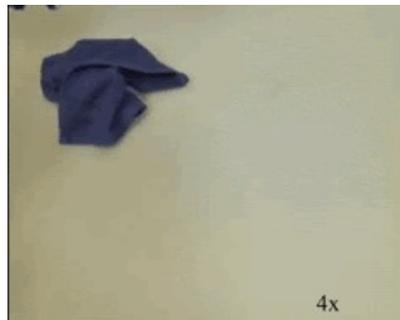
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## Challenge

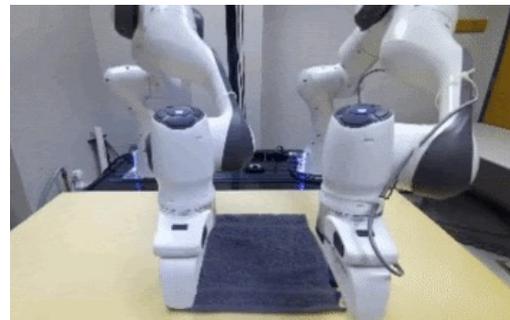
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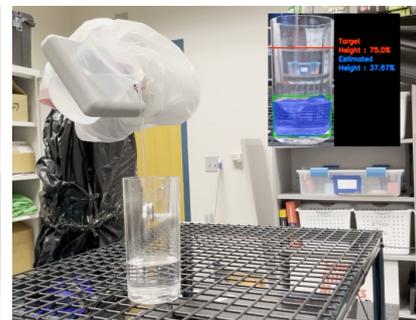
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