

# PEARL

## Efficient Off-Policy Meta-Reinforcement Learning via Probabilistic Context Variables

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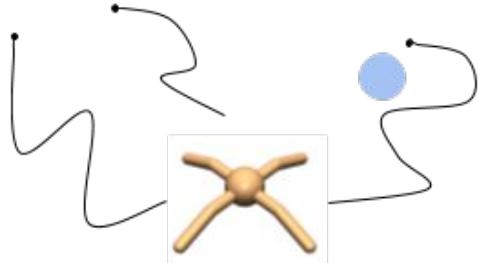


"Hula Beach", "Never grow up", "The Sled" - by artist Matt Spangler, [mattspangler.com](http://mattspangler.com)

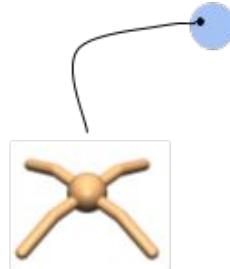
# Meta-Reinforcement Learning

## meta-testing

Given a small amount of experience...

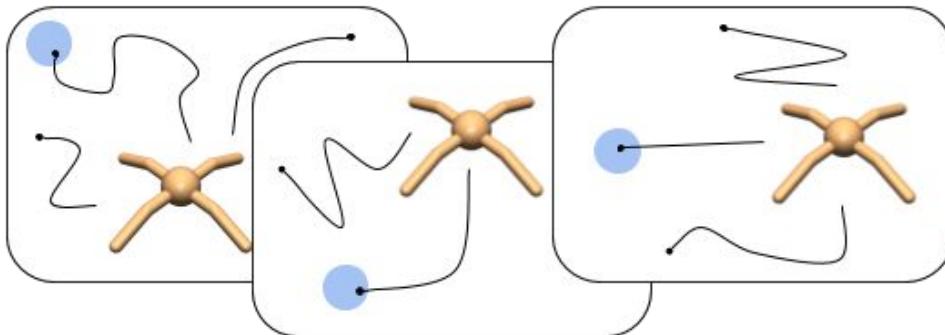


Learn to solve the task!



## meta-training

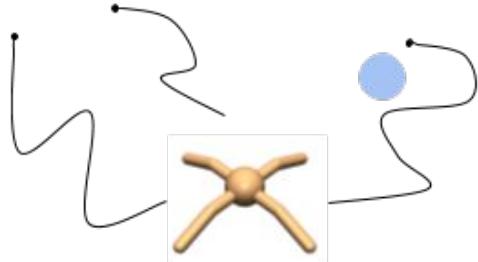
By learning to solve other related tasks



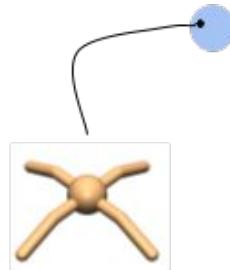
# Meta-Reinforcement Learning

## meta-testing

Given a small amount of experience...

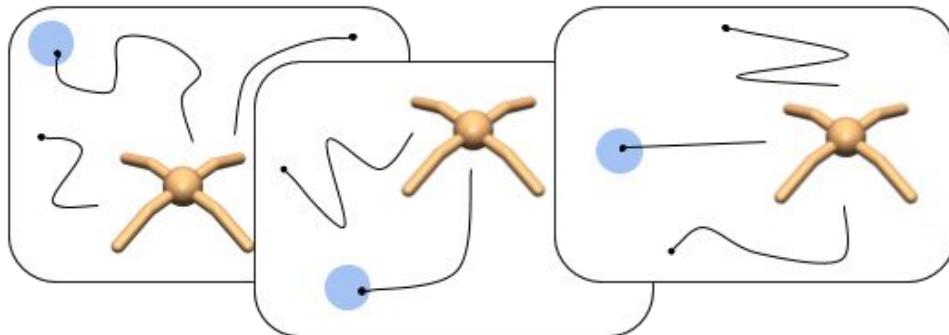


Learn to solve the task!



## meta-training

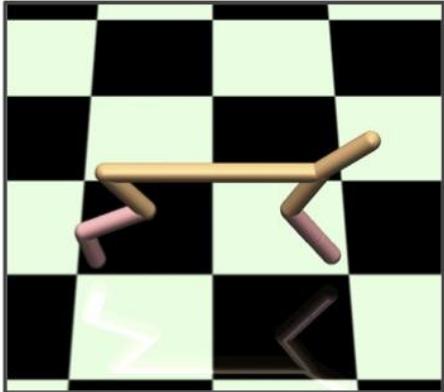
By learning to solve other related tasks



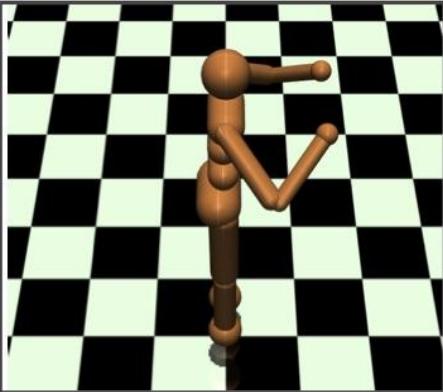
requires data from each task, exacerbates sample inefficiency of RL

# Meta-RL Experimental Domains

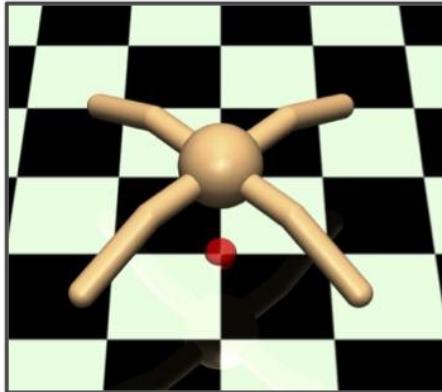
Half Cheetah



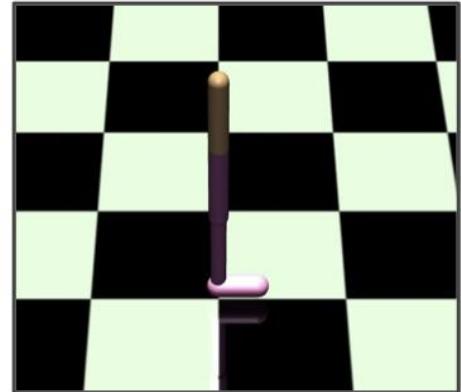
Humanoid



Ant

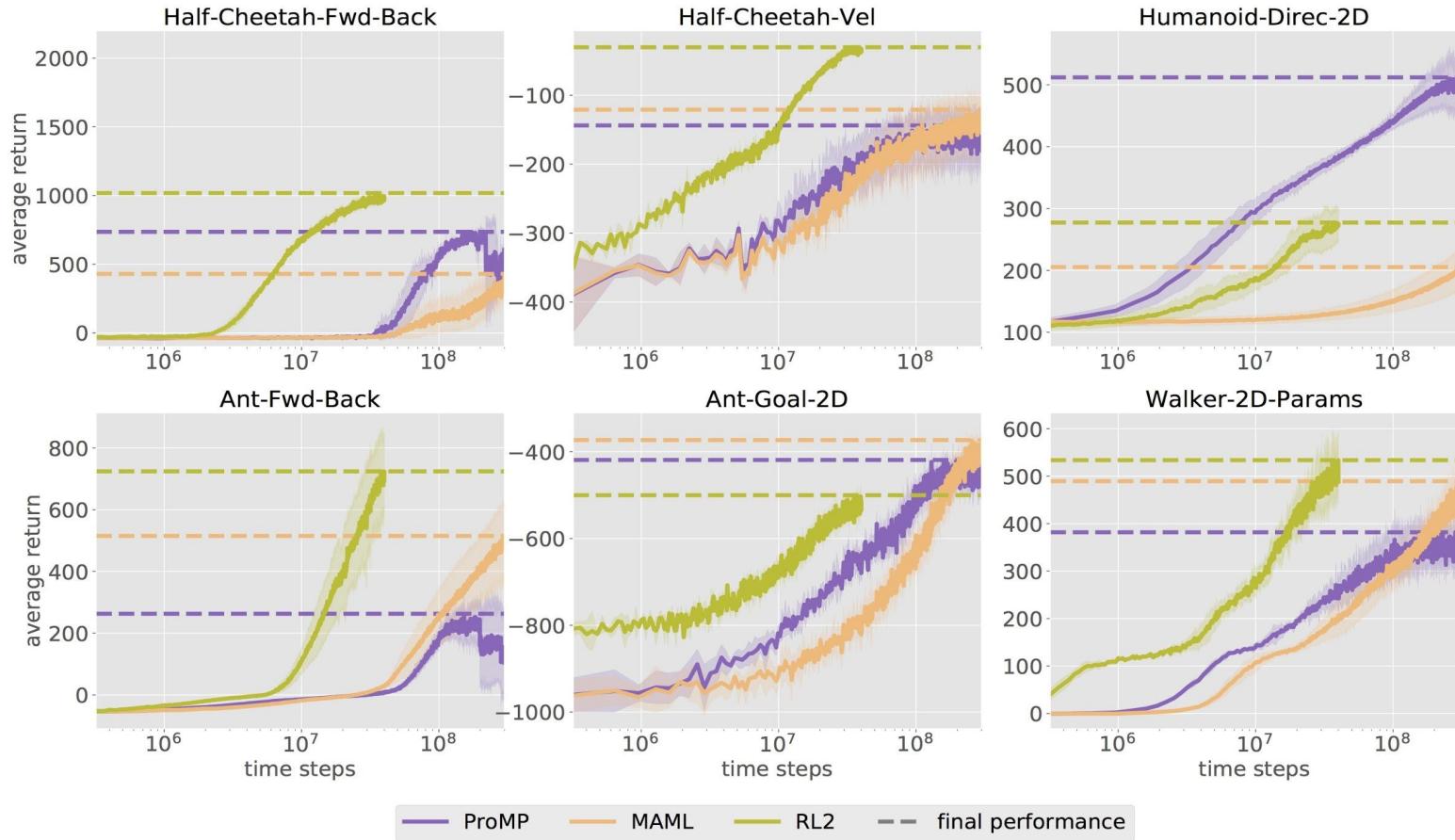


Walker



variable reward function  
(locomotion direction, velocity, or goal)

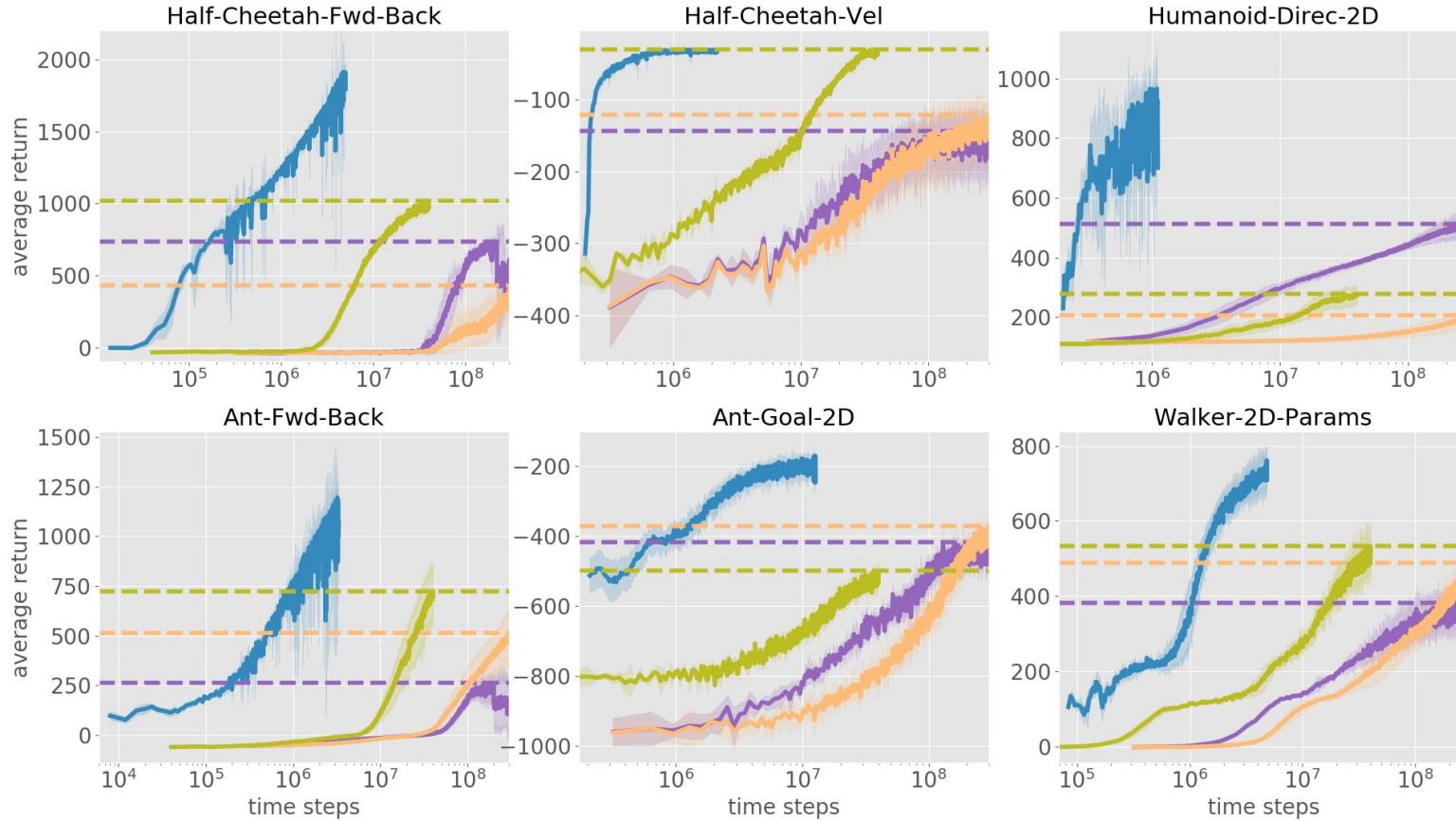
variable dynamics  
(joint parameters)



ProMP (Rothfuss et al. 2019), MAML (Finn et al. 2017), RL2 (Duan et al. 2016)

**20-100X  
more  
sample  
efficient!**

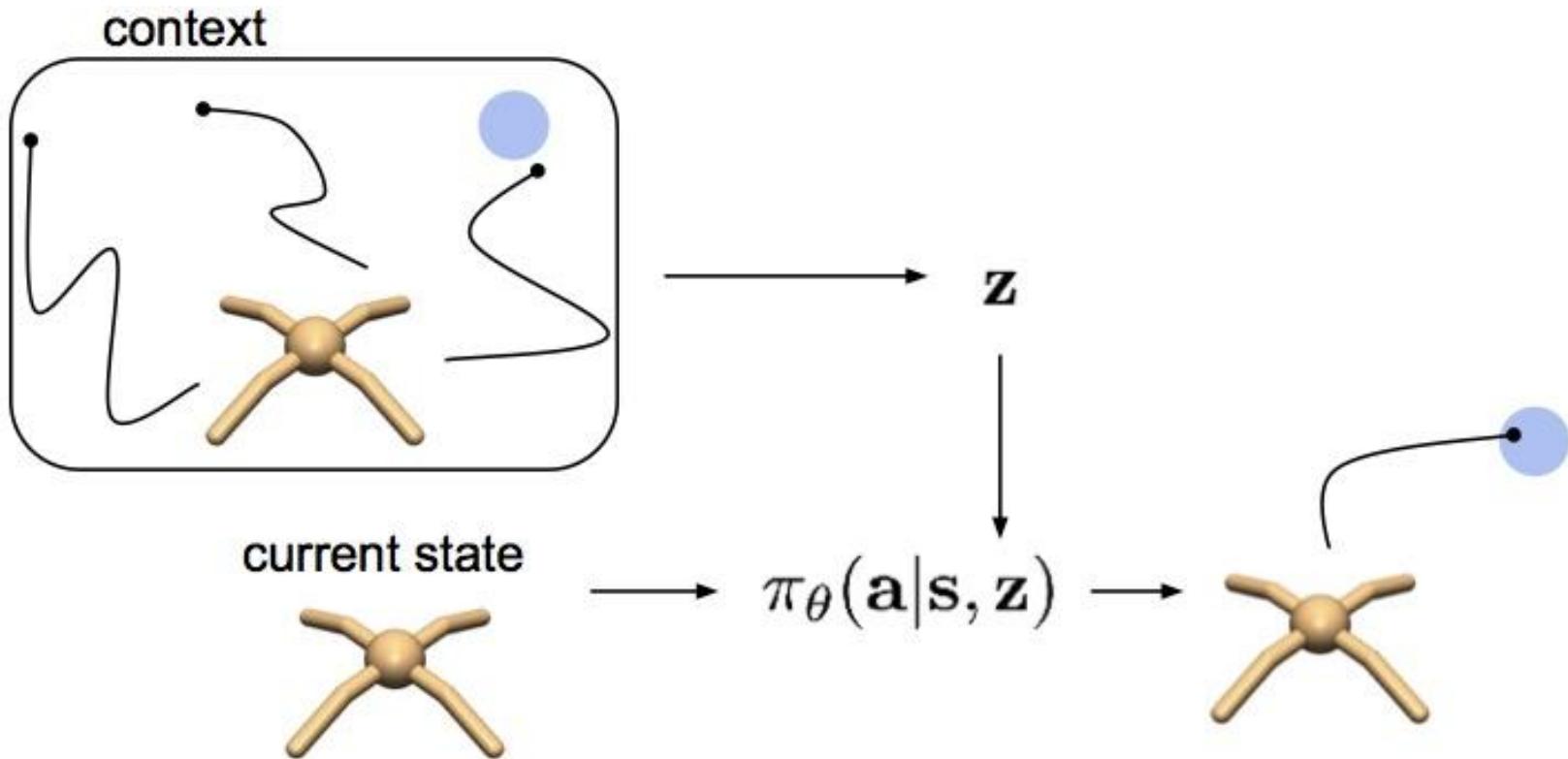
Half-Cheetah-Fwd-Back



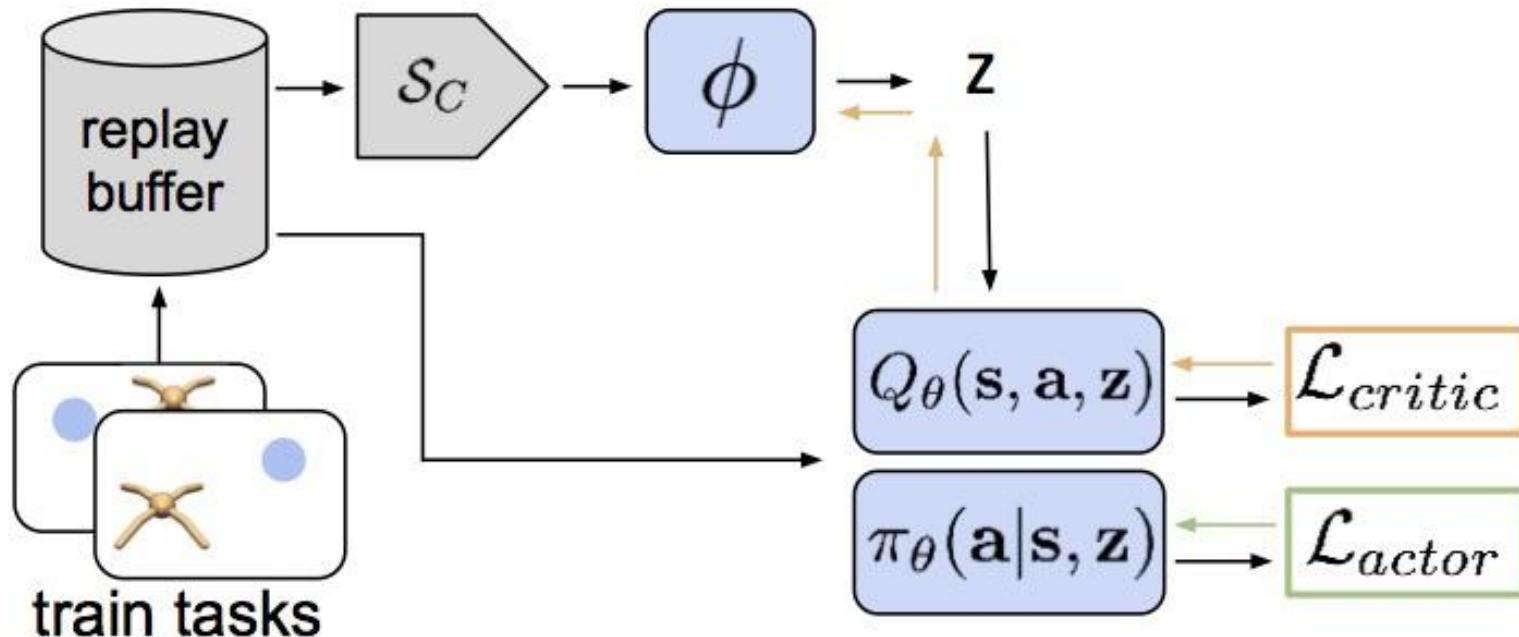
— PEARL (ours) — ProMP — MAML — RL2 — final performance

ProMP (Rothfuss et al. 2019), MAML (Finn et al. 2017), RL2 (Duan et al. 2016)

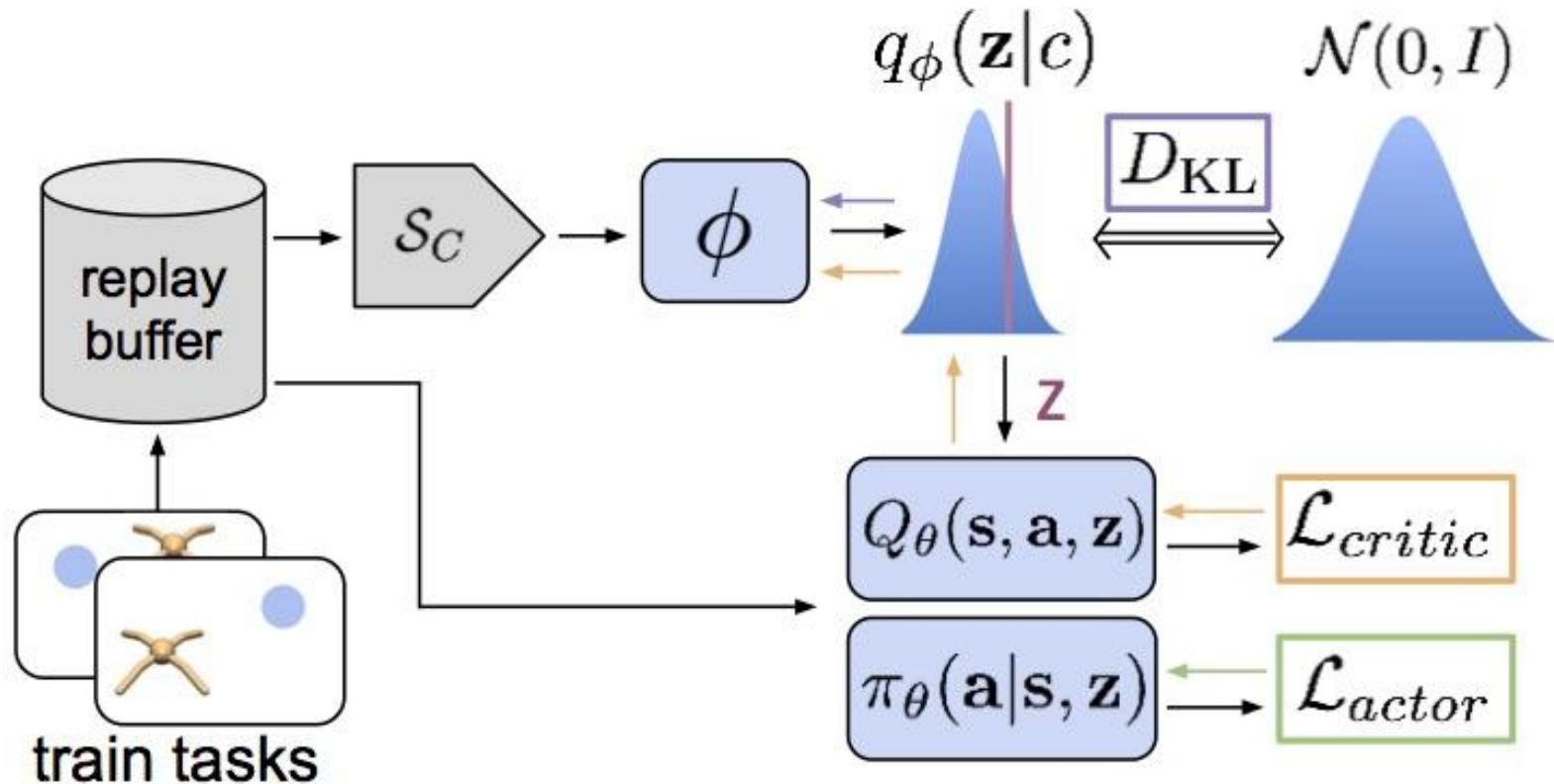
# Disentangle task inference from control



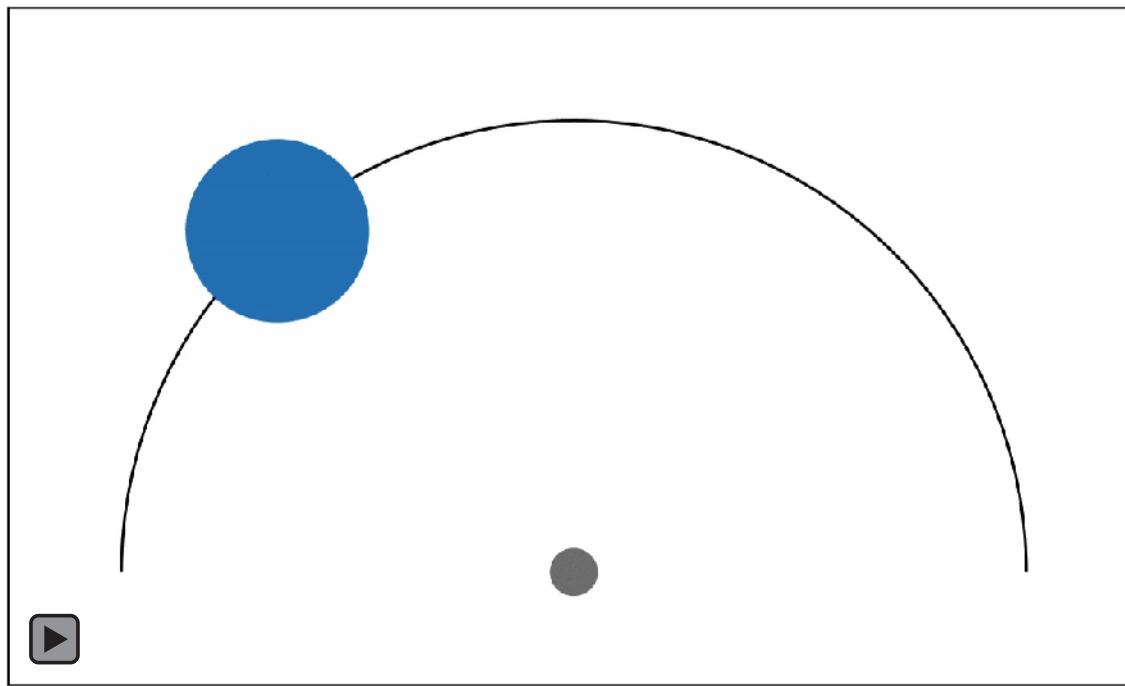
# Off-Policy Meta-Training



# Efficient exploration by posterior sampling



# Posterior sampling in action



# Takeaways

## PEARL

- First off-policy meta-RL algorithm
- 20-100X improved sample efficiency on the domains tested, often substantially better final returns
- Probabilistic belief over the task enables posterior sampling for efficient exploration

arXiv: [arxiv.org/abs/1903.08254v1](https://arxiv.org/abs/1903.08254v1)

GitHub: [github.com/katerakelly/oyster](https://github.com/katerakelly/oyster)

Come talk to us tonight at Poster 40!