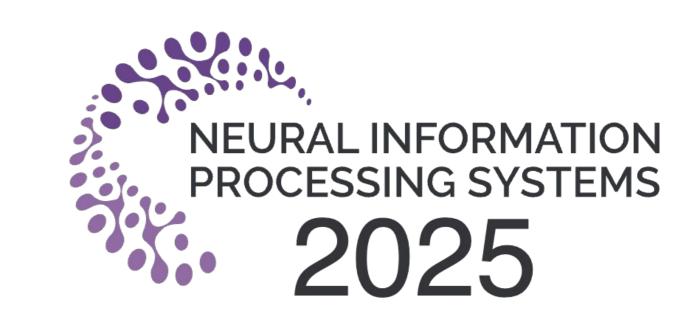
# Enhancing Tactile-based RL for Robotic Control



Elle Miller<sup>1</sup>, Trevor McInroe<sup>1</sup>, David Abel<sup>1,2</sup>, Oisin Mac Aodha<sup>1</sup>, Sethu Vijayakumar<sup>1</sup>

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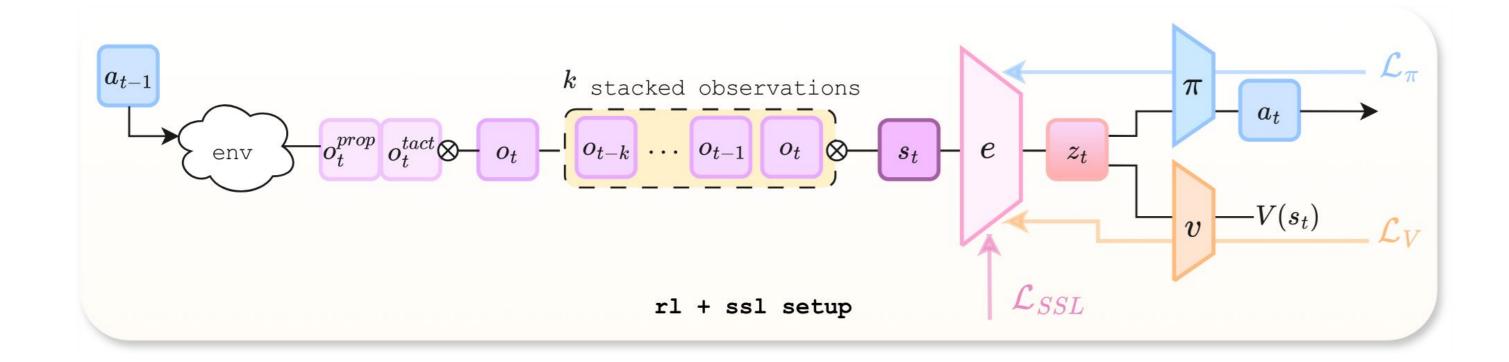
elle-miller.github.io/tactile\_rl





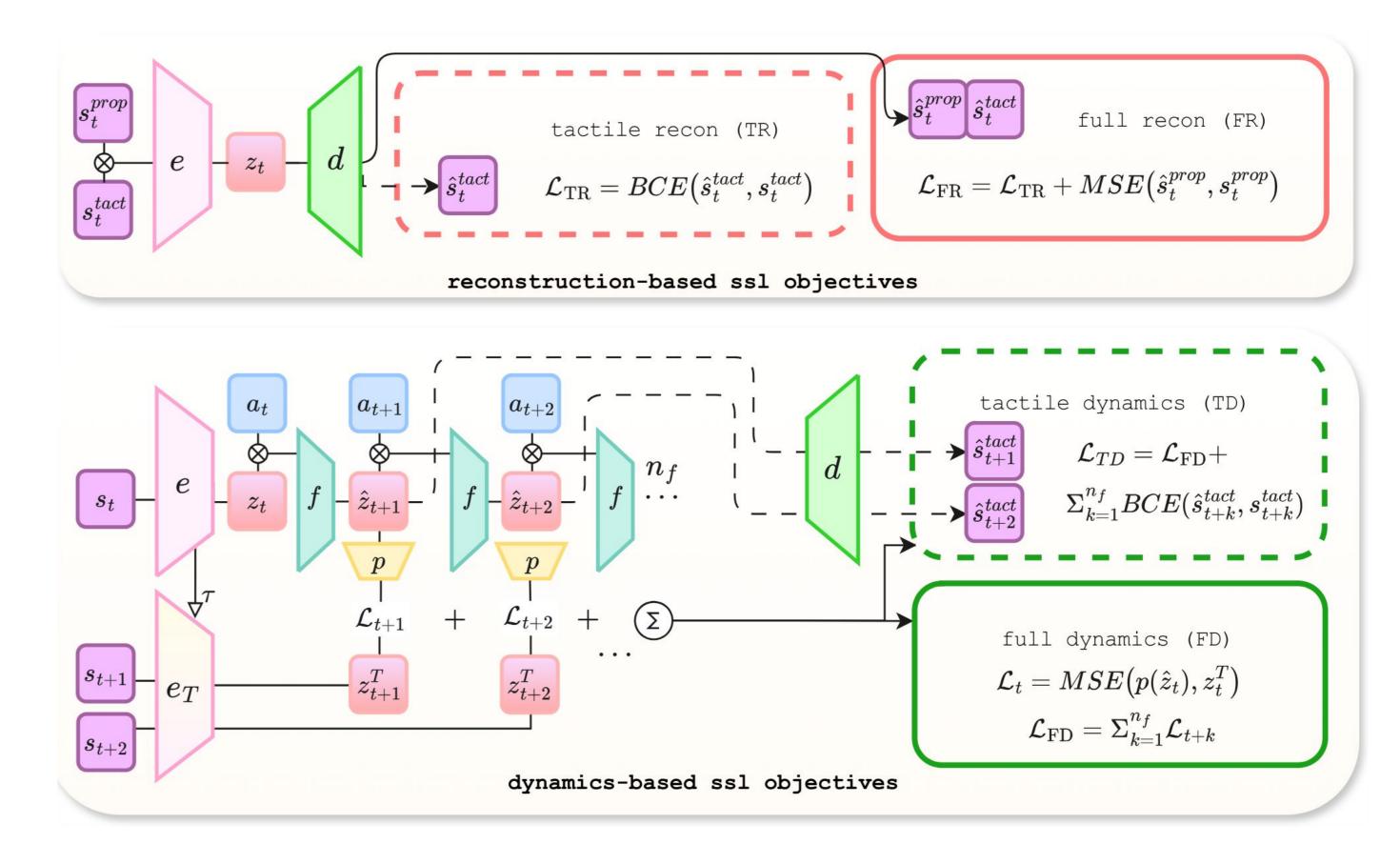
## What's the problem?

RL agents must learn **both** a useful observation representation & policy optimisation with **one** supervisory signal: reward



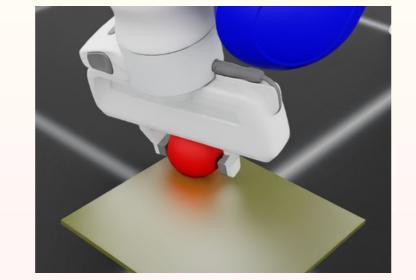
Self-supervised learning (SSL) provides an additional signal for converting complex observations into useful representations

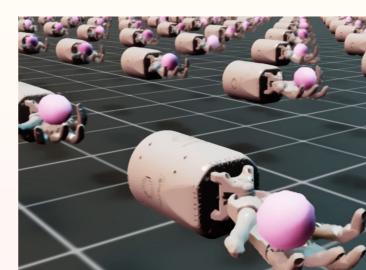
# Proposition: self-supervision



#### RoTO:Robot Tactile Olympiad

To inspire progress in tactile-based dexterity, we are releasing our novel Isaac Lab environments as a new benchmark! We include in-built hyperparameter optimisation, robustly tuned baselines, self-supervision integration, and more.





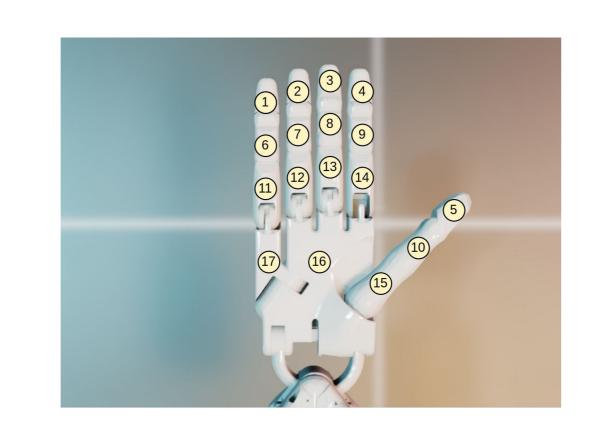


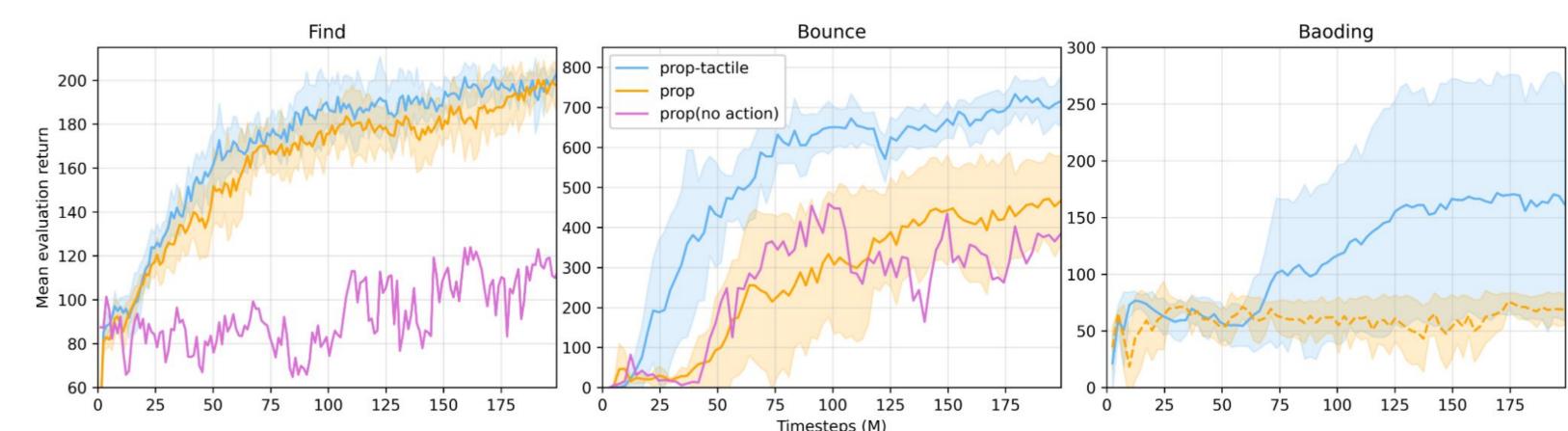
- 1. **Find** an object
- 2. **Bounce** a ball without dropping
- 3. **Baoding** ball rotation

### Finding 1. Sparse binary contacts + proprioception sufficient for superhuman dexterity

Following the intuition that truly blind dexterity should be possible, we studied a setup with no vision or privileged information.

With our methodology we achieve super-human dexterity with only a history of proprioception and 17 binary tactile activations as observations.



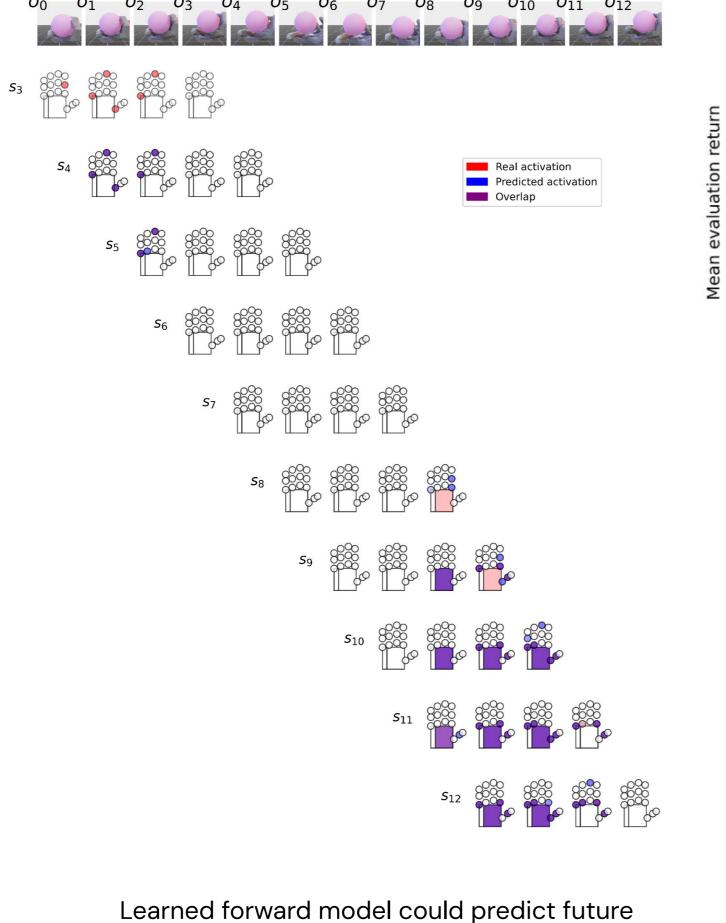


## Finding 2. Self-supervision greatly improves performance of tactile-based agents

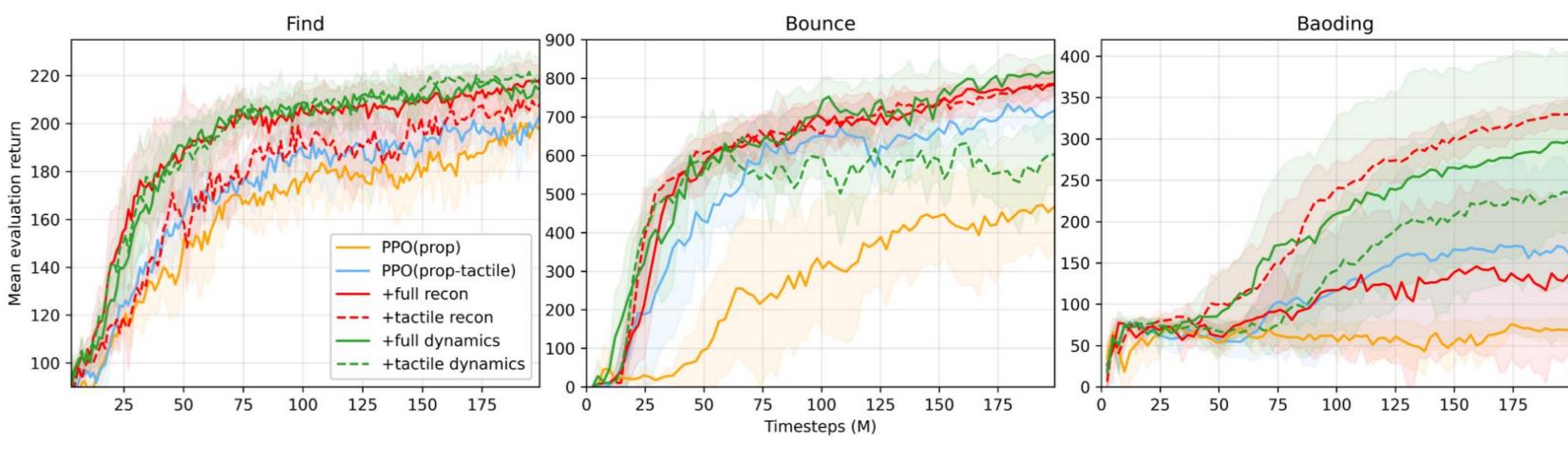
Compared to RL-only agents the best SSL agents on average find an object 36% faster (1.4 vs 1.9 seconds), bounce a ball 8 more times in 10 seconds (79 vs 71), and complete 17 Baoding rotations compared to 5 in 10 seconds.

Dynamics-based objectives had the strongest performance, and led to agents that could predict states multiple steps into the future with high precision (e.g. when and where the ball would land)

We also find that on-policy SSL agents
can benefit from off-policy data, by
separating the auxiliary memory from the
RL rollout memory and increasing its size.



contact states to high precision



Bounce (RL-only)

Bounce + tactile reconstruction

Bounce + dynamics

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PCA of state representation z for one episode for Bounce agents