



# TANDEM3D

## Active Tactile Exploration for 3D Object Recognition

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### Task: Tactile Recognition of 3D Objects

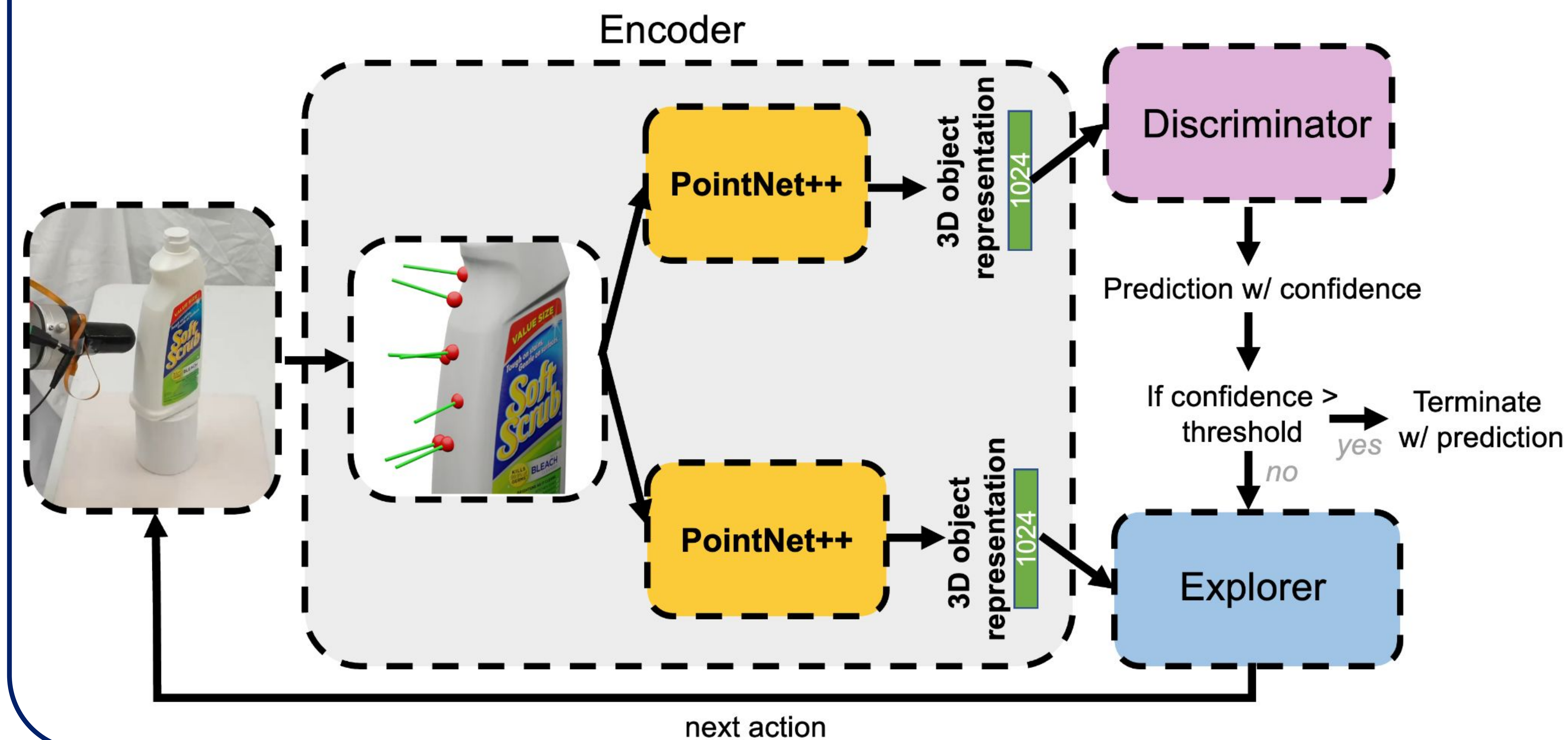
*The robot interacts with the object and needs to identify it by collecting a sequence of contact locations and normals.*

#### Challenges

1. Active sensing modality
2. No simple heuristics
3. Requires advanced Encoding techniques
4. Requires more dexterous action space.



### Methods



#### 6DOF Action Space

We enable 6DOF movements for efficient exploration on 3D surfaces.

#### Encoder

Computes 3D representations from the sequence of sparse tactile information.

#### Discriminator

Looks at this representation and predicts the identity of this object.

#### Explorer

Generates the next action for the robot to take in order to collect more information.

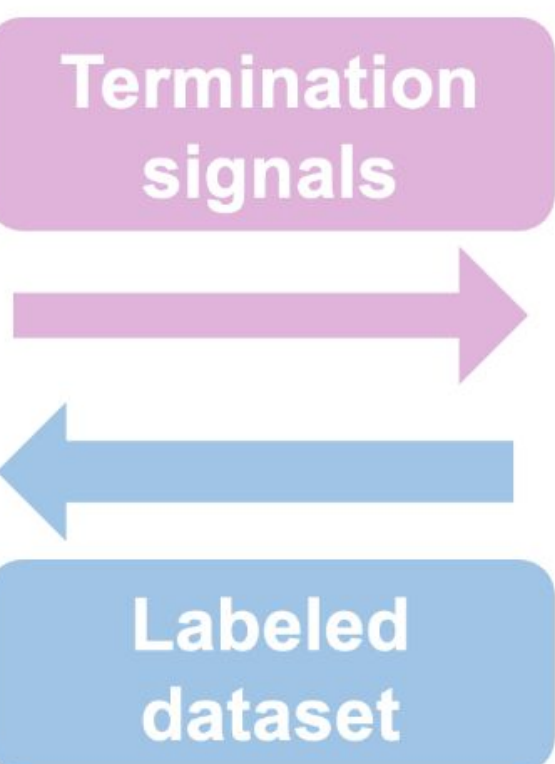
### Co-training

*Despite that we have distinct decision-making and exploration policy modules, their training is highly interleaved.*

Discriminator

Explorer

**CNN  
Supervised Learning**



**RL agent  
PPO**

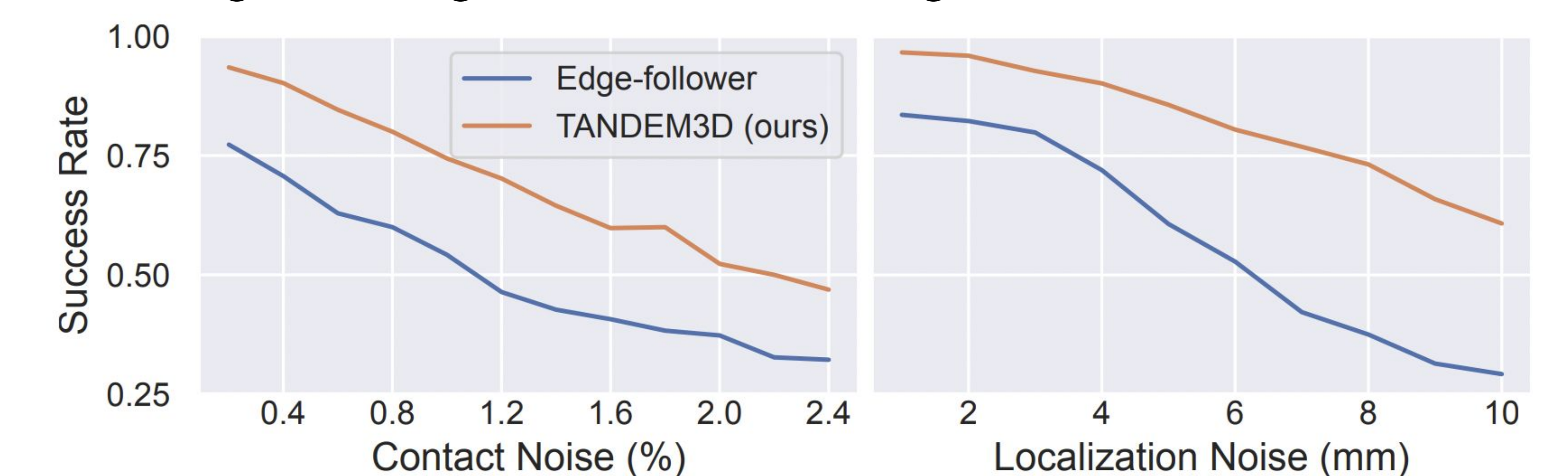
During the co-training process, the discriminator provides termination signals to the explorer and the explorer collects a labeled dataset for the discriminator. **Each component affects the other, improves the other, co-evolves, and then converges.**

**Through co-training, TANDEM3D recognizes 3D objects using ONLY touch sensing with very few actions.**

### Results and Discussion



**TANDEM3D reacts to previous observations and takes moves to the most discriminative areas.** For example, it learns to collect a critical contact point on the pitcher handle by adjusting the angle, utilizing the all-around sensing coverage of the tactile finger.



We incorporate two types of noise during training: (1) contact noise and (2) localization noise. **TANDEM3D** retains a high success rate with higher noise than training