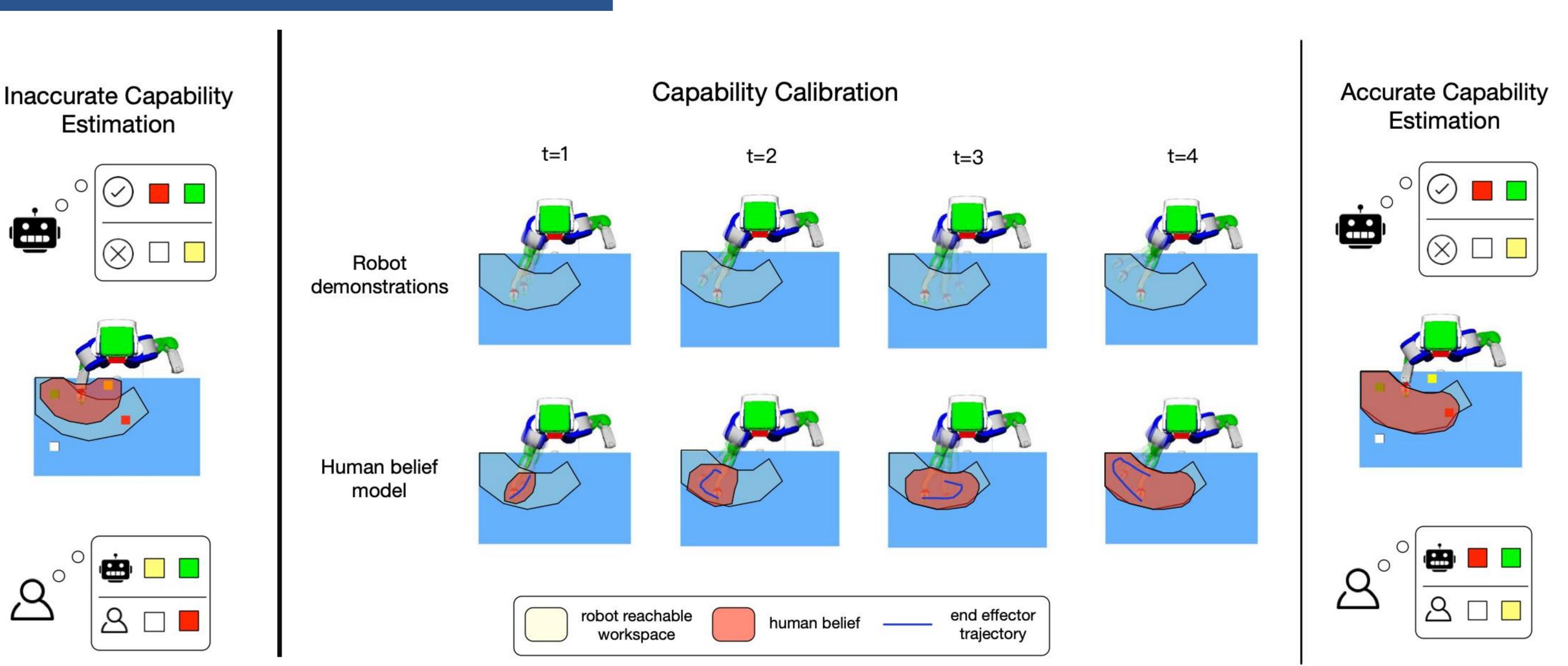


# Show Me What You Can Do: Capability Calibration on Reachable Workspace for Human-Robot Collaboration

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#### Introduction & Motivation

Estimation



Objective: To calibrate humans' estimation of a robot's reachable workspace through a small number of demonstrations before collaboration.

Motivation: Calibration trajectories should optimize both target reaching and human belief formation to generate informative trajectory demonstrations.

### Reachability-Expressive Motion Planning

$$\xi^{t} = \underset{\xi}{\operatorname{argmax}} c_{b}(\xi, b_{h}^{t}, f) + \frac{1}{\lambda} \sum_{i=1}^{N} |\xi_{i+1} - \xi_{i}|^{2}$$

$$c_{b}(\xi, b_{h}, f) = \alpha \sum_{i}^{N} e^{\beta [b_{h}(\phi_{ee}(\xi)) - f(\phi_{ee}(\xi))]}$$

$$b_{h}^{t+1}(x) \propto b_{h}^{t}(x) e^{-\gamma \left( \underset{i}{\min} |\phi_{ee}(\xi_{i}^{t}) - x|^{2} \right)}$$
b

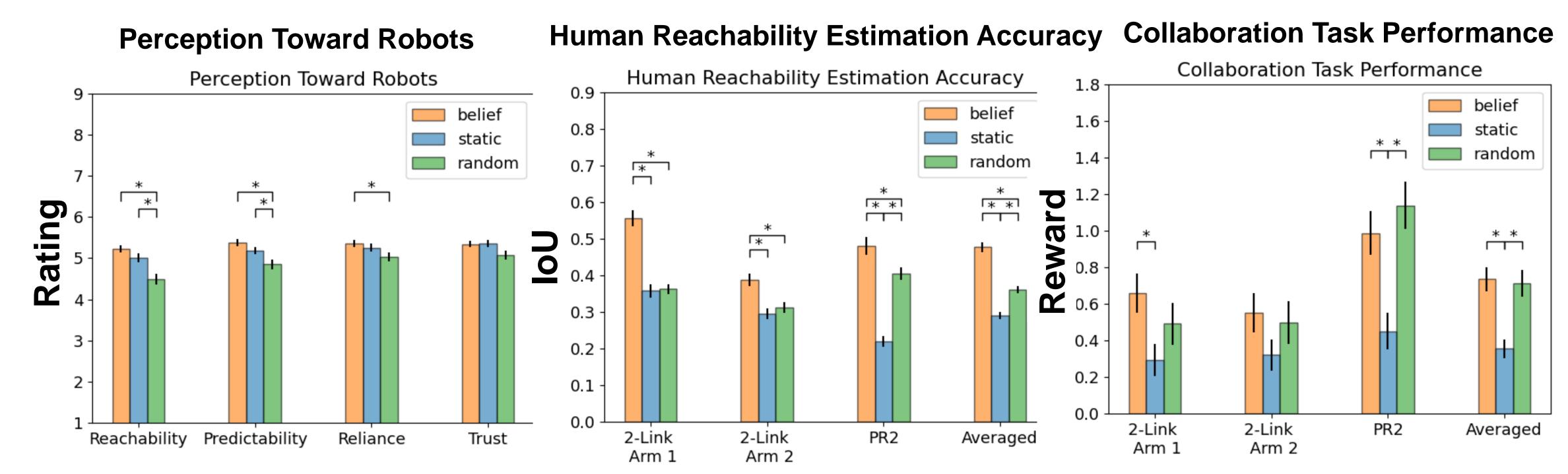
Optimizing a cost function defined on human belief and the trajectory continuation. Trajectories passing underestimated ( $b_h < f$ ) regions trigger lower cost and are prone to be selected. If a point is close to an observed trajectory, it is more likely to be considered as reachable.

# Simulation **Trajectory No. 1 Trajectory No.** 3 **Trajectory No. 3 Trajectory No. 4 Trajectory No. 5 Query Points** Simulated Human Robot Collaboration Performance Simulated Reachability Estimation Accuracy 2link Arm

### **User Study Results**

Our user study (N=202) shows a short calibration using REMP leads to (i) better user reachability estimation of the robot;

- (ii) higher rewards in a subsequent human-robot collaboration;
- (iii) better user perception of the robot.



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