# High-Confidence Guarantees for Safe Reward and Policy Learning Under Uncertainty

**Daniel Brown** 















## Objectives are often very hard to specify!







# The Alignment Problem

How do we get Al systems to do what we, as humans, actually want them to do?

## Robust behavior is often very hard to specify!







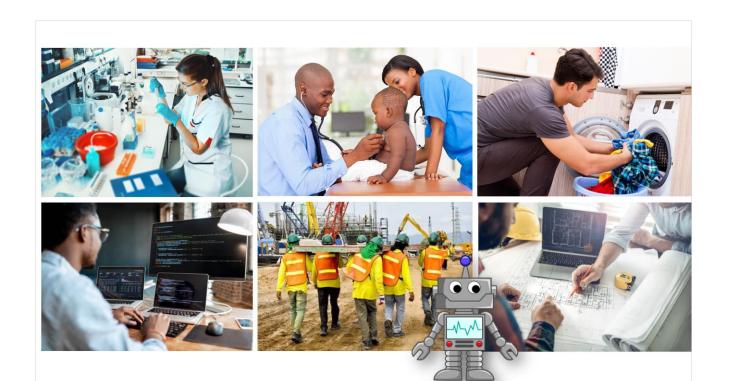
#### How do we know if an AI system is robust?

Robustness: Acceptable behavior in the presence of uncertainty and unusual circumstances.

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The Alignment Problem



### Human input is messy!







# Aligned, Robust, and Interactive Autonomy (ARIA) Lab





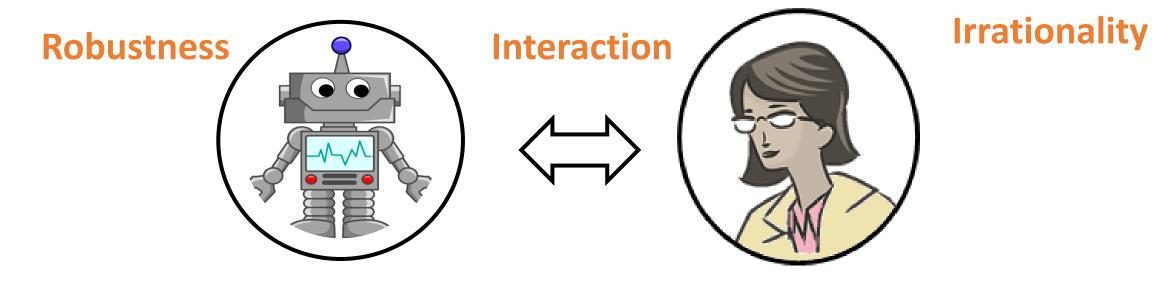






Our research seeks to efficiently incorporate human input into both the theory and practice of robust and aligned Al systems.

# The Alignment Problem



**Uncertainty** 

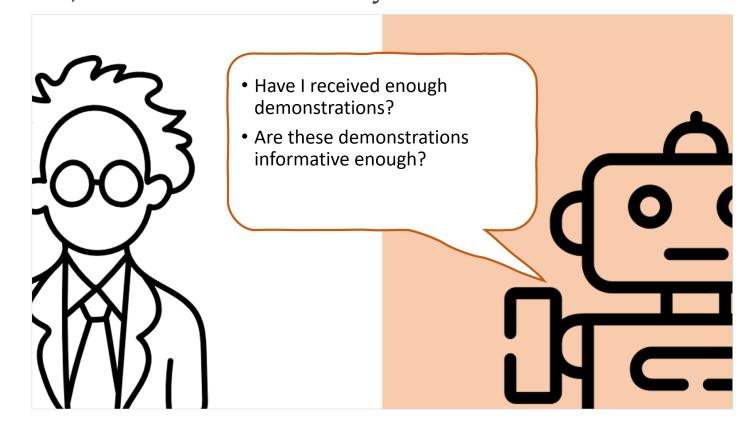
**Feedback** 

#### Autonomous Assessment of Demonstration Sufficiency via Bayesian Inverse Reinforcement Learning

Tu (Alina) Trinh

Haoyu Chen

Daniel S. Brown



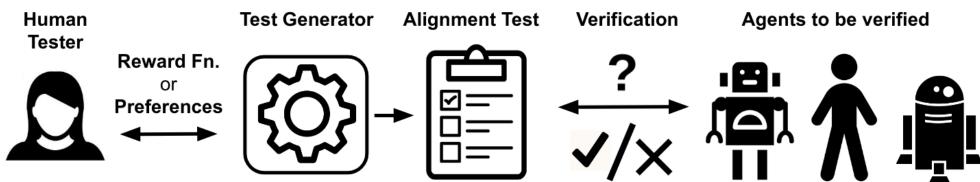
Best paper finalist award at International Conference on Human-Robot Interaction (HRI'24)!

#### **Research Goal 1:**

Probabilistic performance bounds when learning rewards from any type of human feedback.

#### Value Alignment Verification for Al systems





Research Goal 2: Unit Tests for Reward and Policy Alignment.

#### **Goal Misgeneralization in Deep Reinforcement Learning**

Lauro Langosco \* 1 Jack Koch \* Lee Sharkey \* 2 Jacob Pfau 3 Laurent Orseau 4 David Krueger 1

#### **Abstract**

We study goal misgeneralization, a type of o of-distribution generalization failure in reinforment learning (RL). Goal misgeneralization ( curs when an RL agent retains its capabilities o of-distribution yet pursues the wrong goal. F instance, an agent might continue to competen avoid obstacles, but navigate to the wrong pla

#### **Goal Misgeneralization: Why Correct Specifications Aren't Enough For Correct Goals**

Rohin Shah \* † rohinmshah@deepmind.com

Mary Phuong †

Victoria Krakovna

CAUSAL CONFUSION AND REWARD MISIDENTIFICA-TION IN PREFERENCE-BASED REWARD LEARNING

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# Research Goal 3: Robust Policy Optimization Under Reward Uncertainty

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