

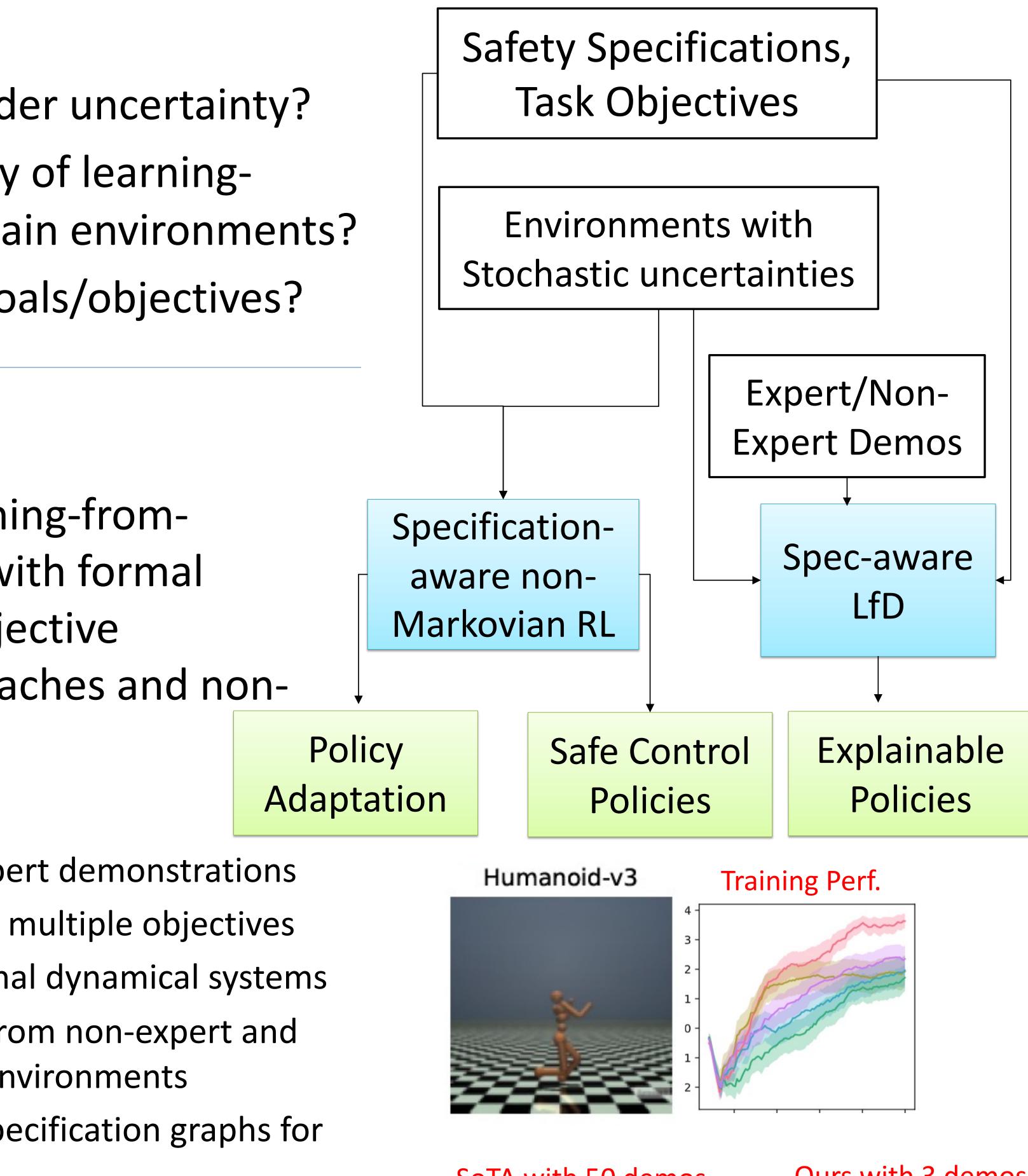
#### **CPS Small: Uncertainty-aware Framework for Specifying, Designing and Verifying Cyber-Physical Systems** Award # 1932620 Nov 2019 – Oct 2023 Paul Bogdan (PI), Jyotirmoy V. Deshmukh (co-PI), University of Southern California

## **Challenges:**

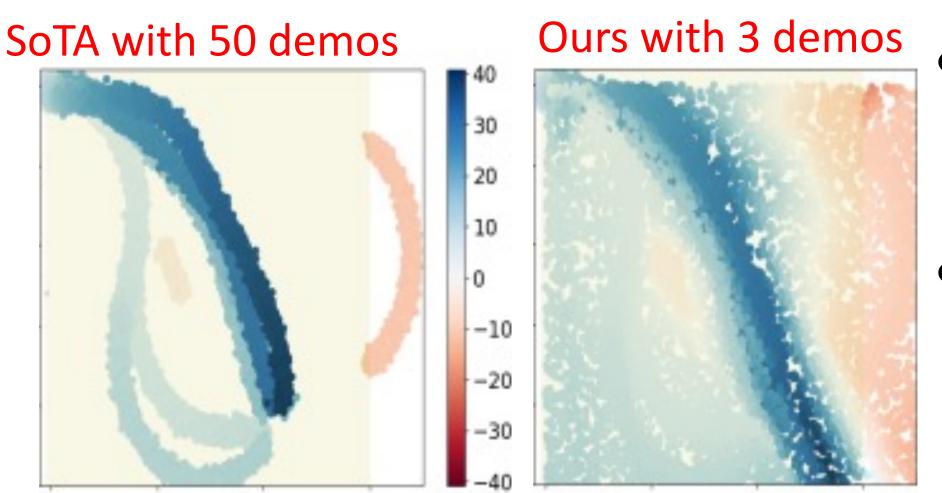
- How can we safely control CPSs under uncertainty?
- How do we enhance interpretability of learningenabled CPS that operate in uncertain environments?
- How do we optimize for multiple goals/objectives?

### **Solutions:**

- Technical approach: Combine Learning-from-Demonstrations (LfD) approaches with formal specifications, Investigate multi-objective Reinforcement Learning (RL) approaches and non-Markovian environments
- **Key Innovations**
- Algorithm to learn control policies from expert demonstrations
- Policy Adaptation algo to properly optimize multiple objectives
- Algorithm for non-Markovian RL for fractional dynamical systems
- LfD-STL paradigm to learn control policies from non-expert and sub-optimal demonstrations in stochastic environments
- Reward representation using explainable specification graphs for multi-objective LfD methods







## **Scientific Impact:**

- environments that scale linearly in the (non-expert demos)
- with SoTA RL solvers
- multi-objective settings

# **Broader Impact:**

- safe autonomy
- demonstrations
- courses included in courses at USC

Learning safe control policies in uncertain dimension of the state (expert demos) and with orders of magnitude lower sample complexity

New Multi-objective RL method compatible

Enhanced explainability in policies generated for

Safe CPS applications will improve public trust in

Opens applications such as robot therapeutics, human service robots, learning from driving

Formal specifications and LfD + Formal Specs in Safe control design for systems with highly

nonlinear, history-dependent uncertainties