



1

## APPLD: Adaptive Planner Parameter Learning From Demonstration

Xuesu Xiao<sup>1\*</sup>, Bo Liu<sup>1\*</sup>, Garrett Warnell<sup>2</sup>, Jonathan Fink<sup>2</sup>, and Peter Stone<sup>1</sup>

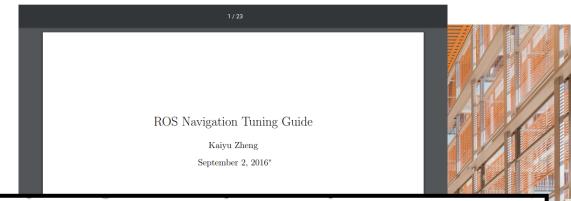


<sup>1</sup>The University of Texas at Austin

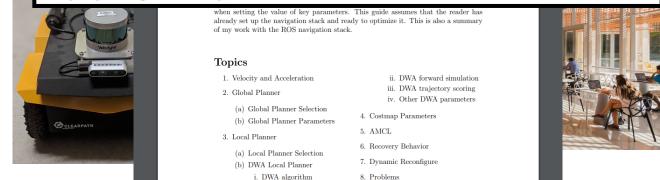
<sup>2</sup>Army Research Laboratory

\*Equally Contributing Authors

**Motivation:** Deploying an autonomous navigation system in a new environment is not as straightforward as it may seem.



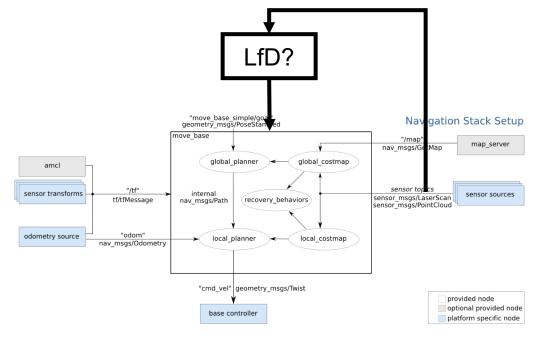
by processing data from odometry, sensors and environment map. Maximizing the performance of this navigation stack requires some fine tuning of parameters, and this is not as simple as it looks. One who is sophomoric about the concepts and reasoning may try things randomly, and wastes a lot of time.



Inspiration: Humans do this effortlessly.

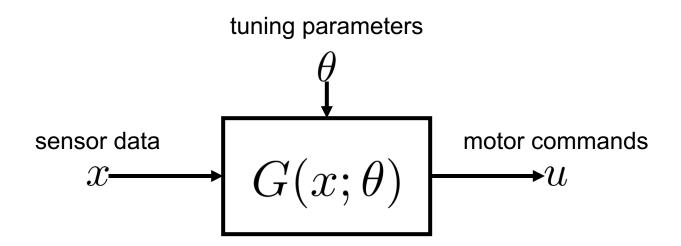


**Central Question:** Can we squeeze more robust performance out of our existing navigation systems using LfD and limited human interaction?



ROS move\_base navigation stack

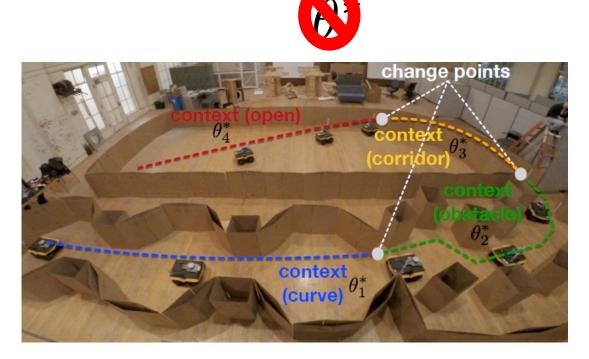
Proposed: Use behavioral cloning to "tune" any navigation stack.



**Behavioral Cloning**: Learn parameters from a demonstration using supervised learning.

$$\theta^* = \arg\min_{\theta} \sum_i \ell(G(x_i; \theta), u_i)$$

**Context Problem:** Humans exhibit qualitatively different navigation behaviors in qualitatively different environments.



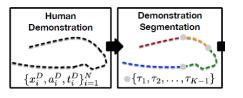
 $\{\theta_1^*,\ldots,\theta_K^*\}$ 

**APPLD:** Adaptive planner parameter learning from demonstration

1. Collect demonstration.

$$\longrightarrow \mathcal{D} = \{(x_1, u_1), \dots, (x_N, u_N)\}$$

2. Perform automatic demonstration segmentation.



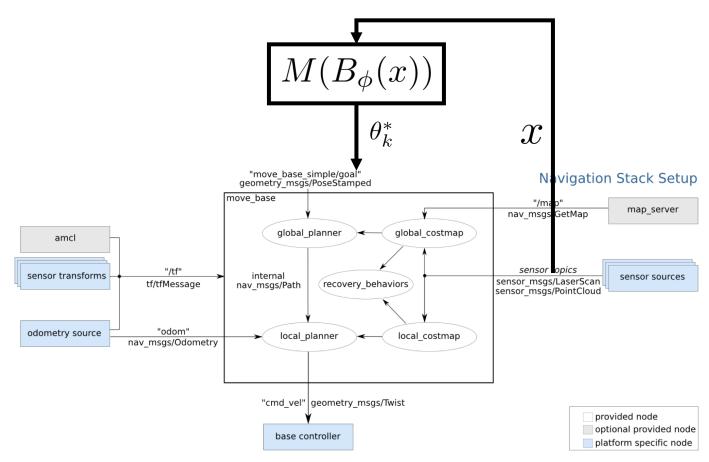
 $G(\cdot; \cdot)$ 

 $A_{\rm black-box}$ 

- 3. Use black-box optimization to find set of optimal parameters.
- 4. Use supervised learning to train a context predictor.

$$x \longrightarrow B_{\phi} \longrightarrow k$$

#### **APPLD Deployment**



#### **Experiments**



Robot: Clearpath Jackal (Velodyne Puck lidar)



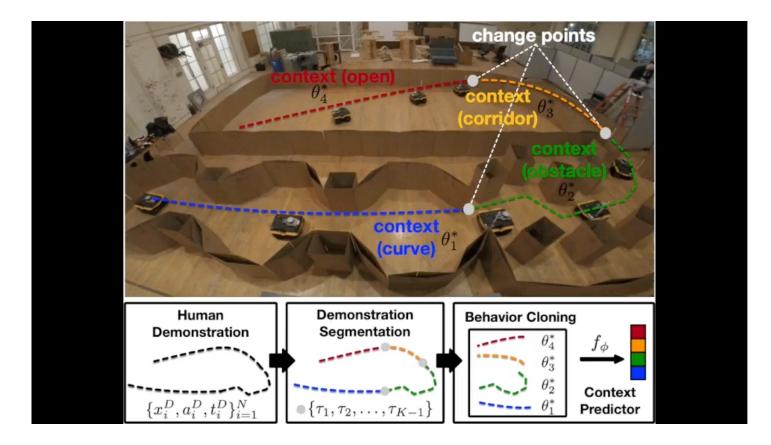
Human: An author (Xbox wireless controller)



Environment: Challenging obstacle course

### Results

#### APPLD: Deployment in demonstration environment



### Results

#### Xuesu Xiao xiao@cs.utexas.edu

Different robot, navigation stack, and environment

