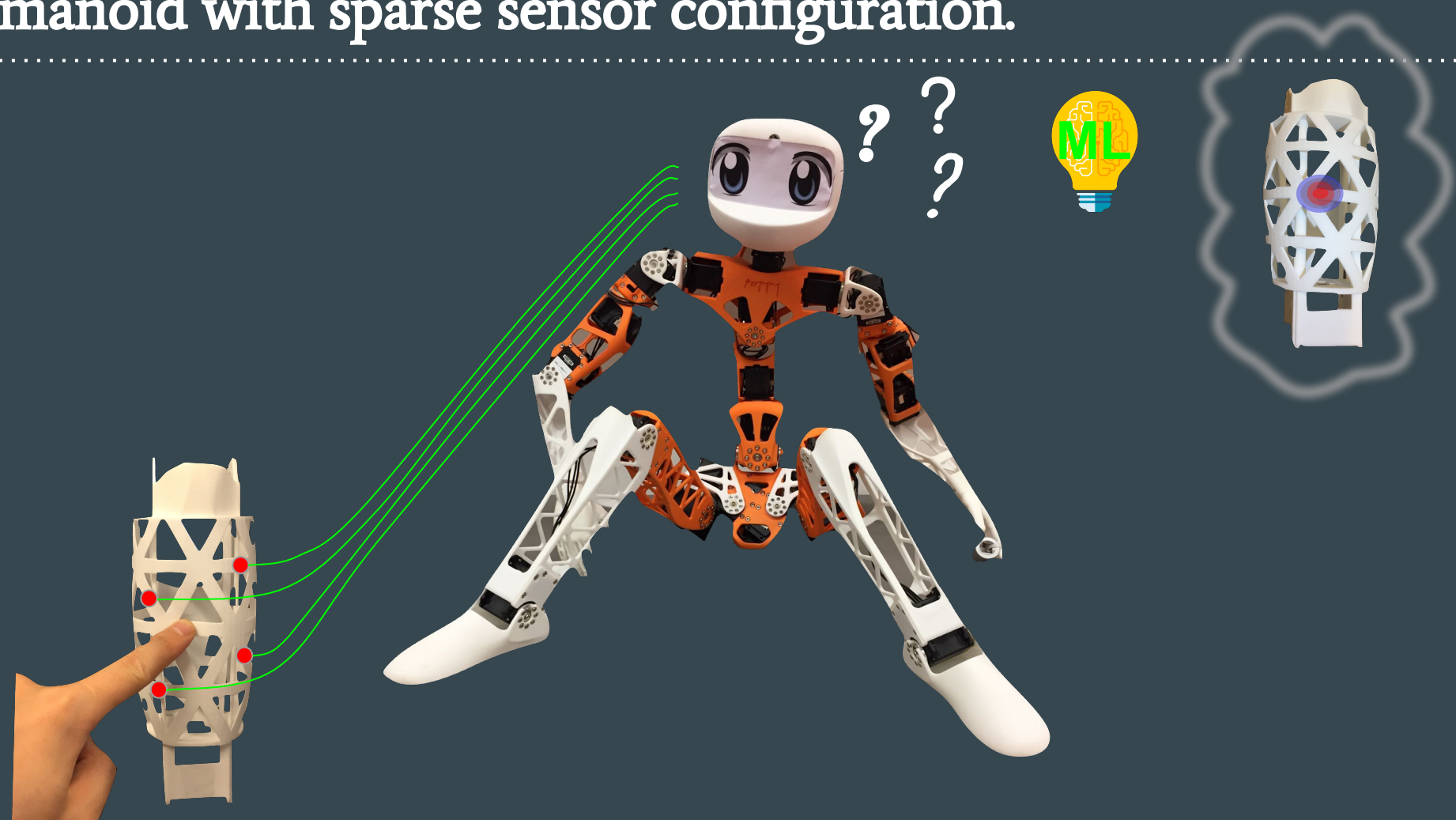


# Robust Affordable 3D Haptic Sensation via Learning Deformation Patterns

Huanbo Sun & Georg Martius

## Goal

TO design one 3D haptic system capable of covering all surfaces of humanoid with sparse sensor configuration.



Optimal Positions

All Positions

Sensor Value

$$A = \operatorname{argmin}_{A \subset N} (\mathbb{E}[\|F(X_{\cdot}, A) - p\|_2^2] < \delta)$$

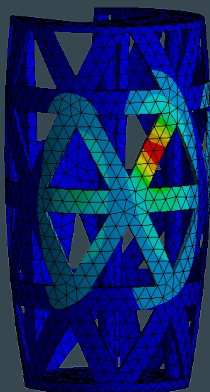
ML Model

Force Information

Prediction Accuracy

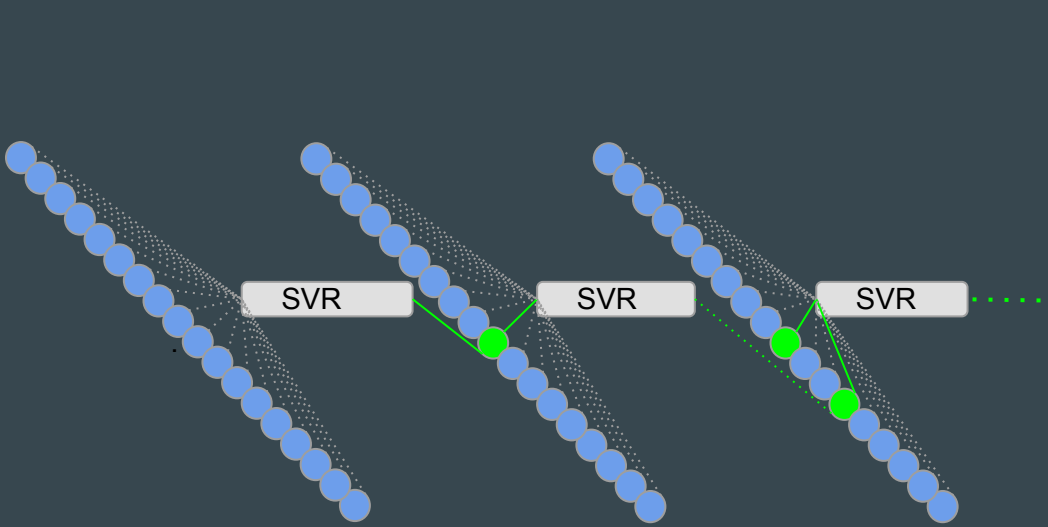
## Optimal Placement: Methods

### Data-driven

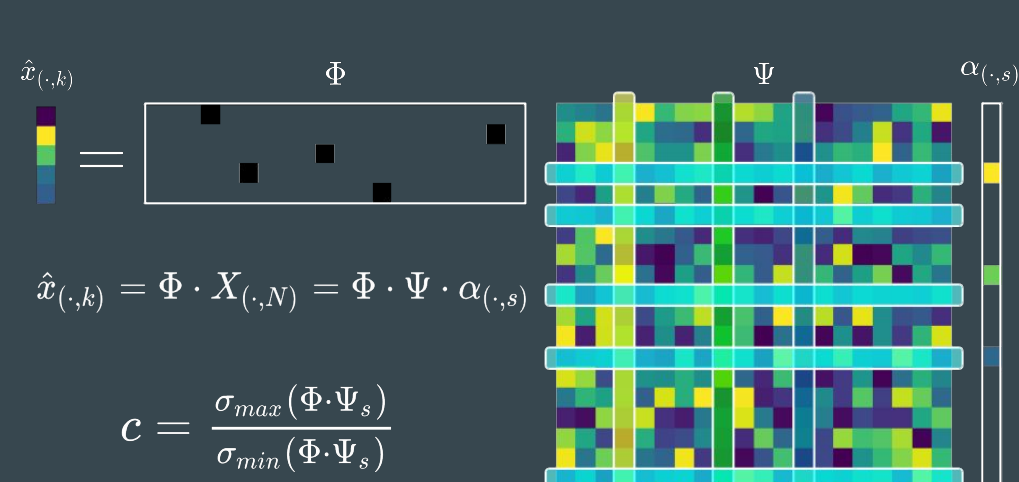


Dataset:  
X: Deformation  
p: Force

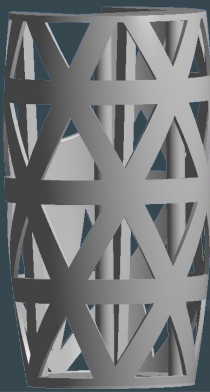
### Greedy Support Vector Regression



### Compressive Sensing

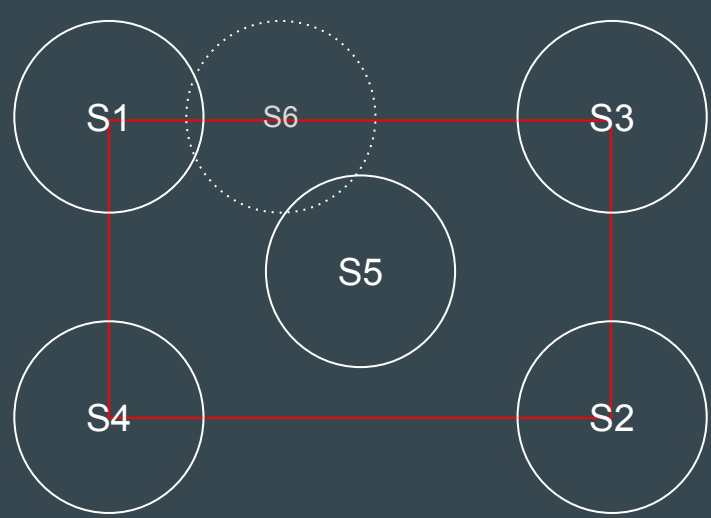


### Model-based

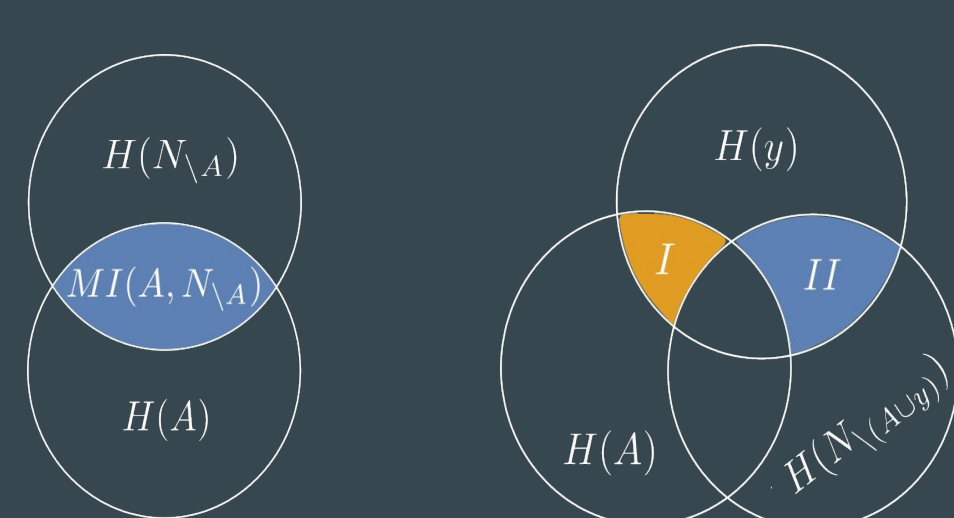


Dataset:  
X: Deformation  
p: Force

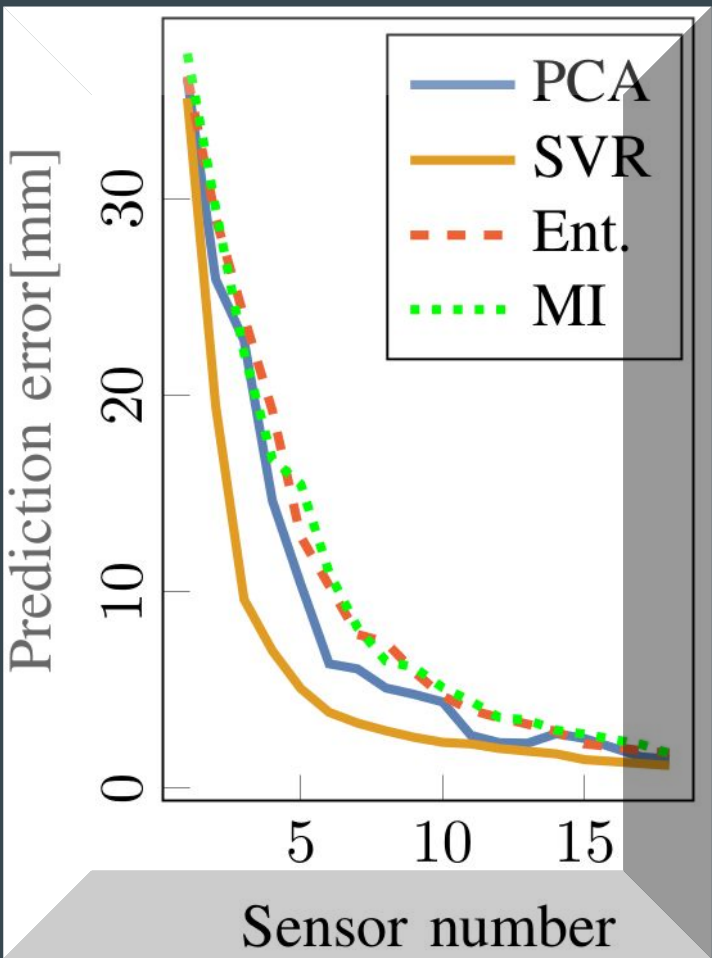
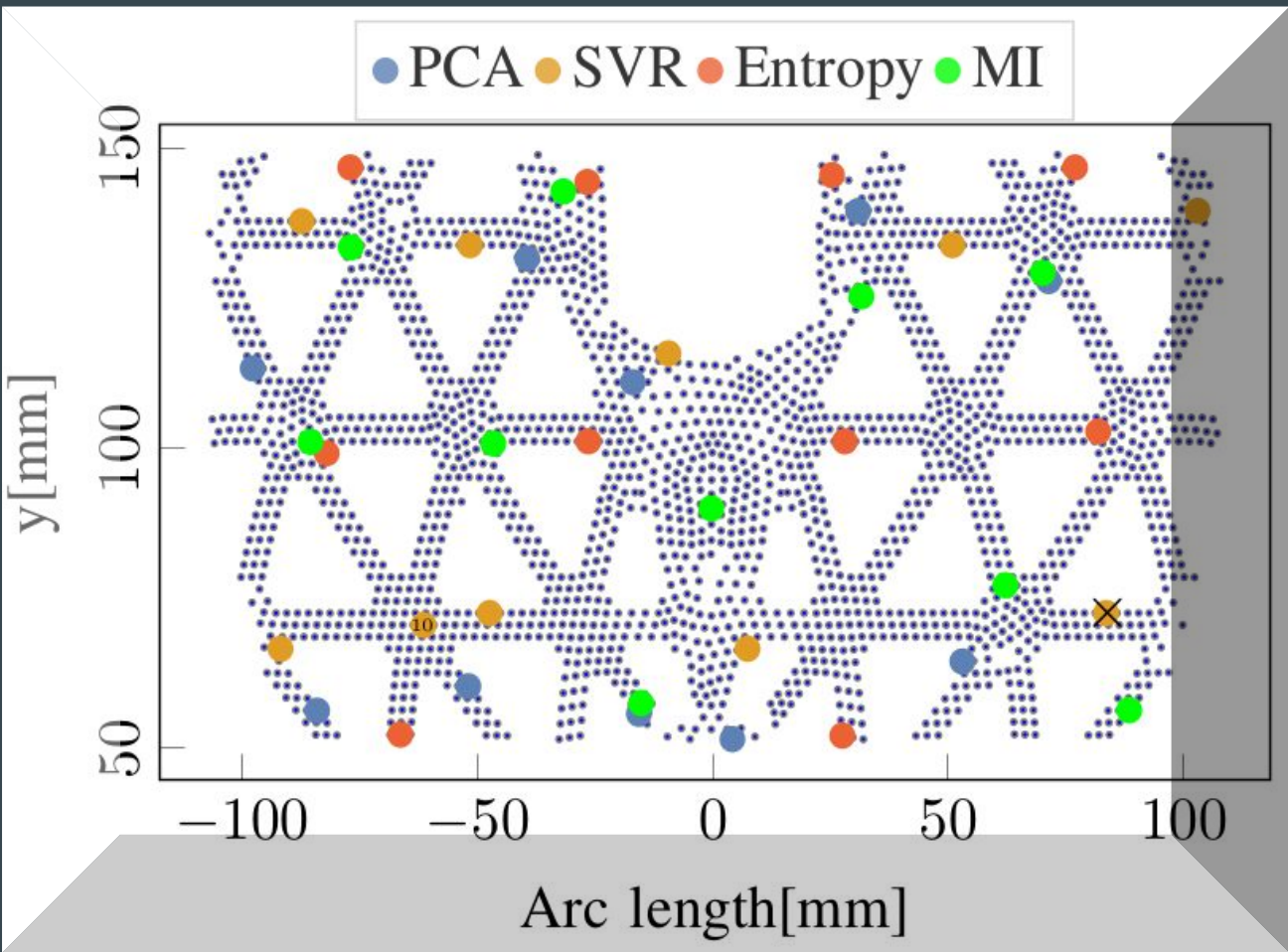
### Entropy



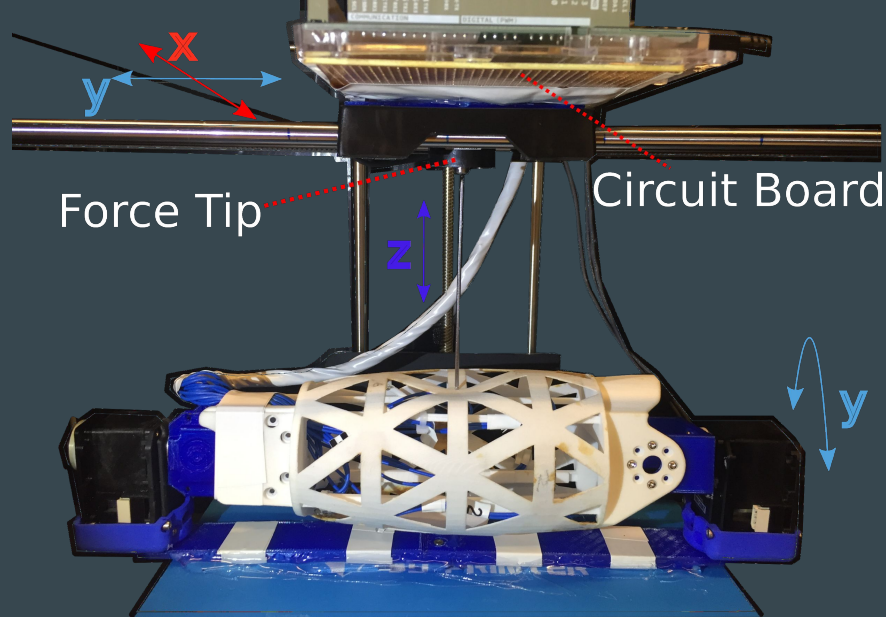
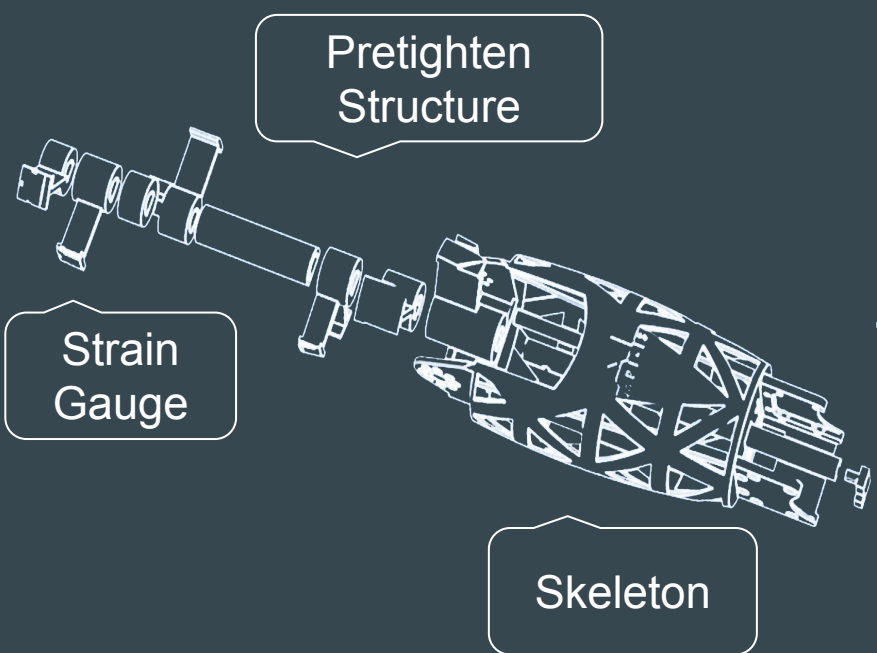
### Mutual Information



## Optimal Placement: Results

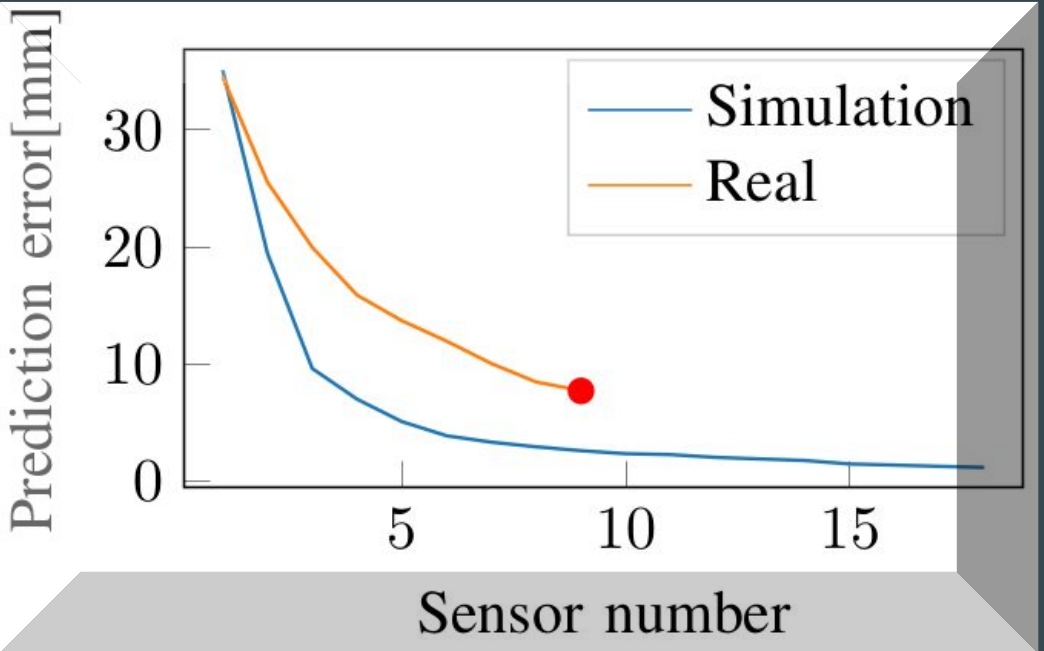


## Hardware Implementation



## Hardware Implementation: Result

### Single touch detection



Force Interval [N]	Position Error [mm]	Amplitude Error [N]
0 - 4.9	25.43 +/- 13.36	1.05 +/- 1.01
4.9 - 9.8	11.95 +/- 11.85	1.19 +/- 1.19
9.8 - 19.6	5.90 +/- 7.79	1.42 +/- 1.78
19.6 - 34.3	4.48 +/- 6.29	1.54 +/- 2.21

### Multiple touch detection

