



# Semi-physical Modeling of Soft Pneumatic Actuators with Stiffness Tuning

MECC/ALDSC 2023 10/04/23

Lake Tahoe, Nevada

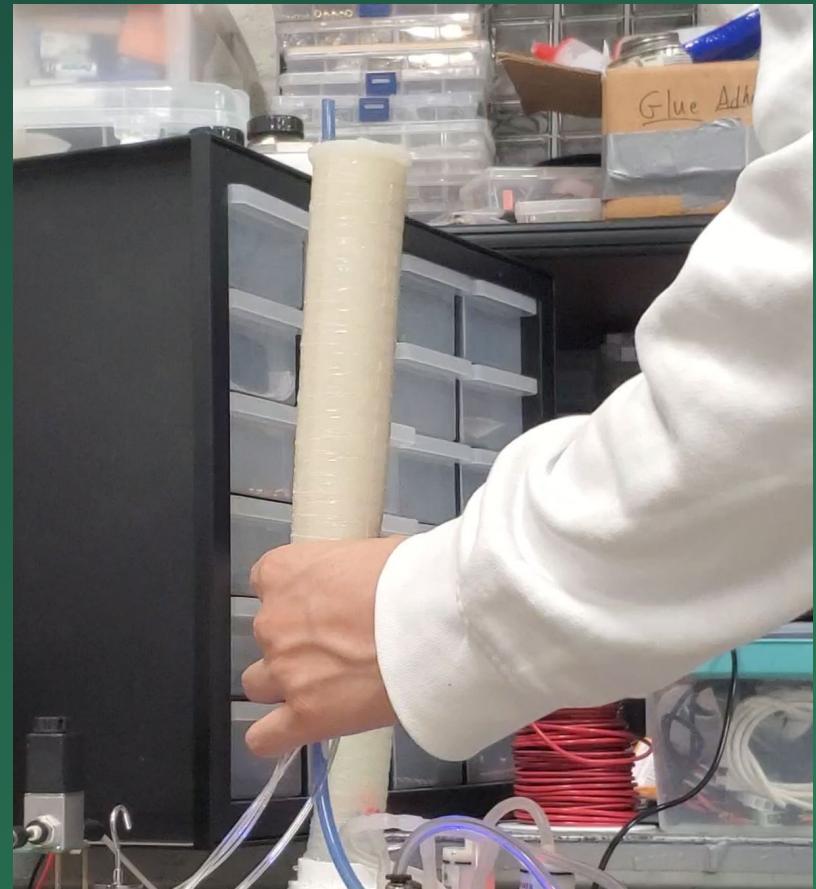
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# Soft Robotics

Why use soft robots?

- Flexible soft material
  - Safety around humans
  - Human Robot interaction
  - Handling of delicate materials (fruit, vegetables, baked goods)
- Continuum nature and high degrees of freedom
  - Versatile trajectories

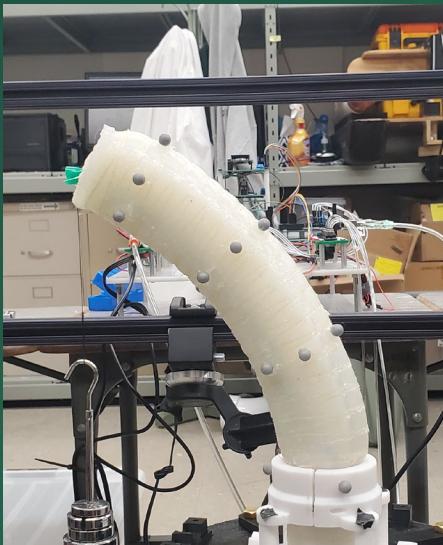
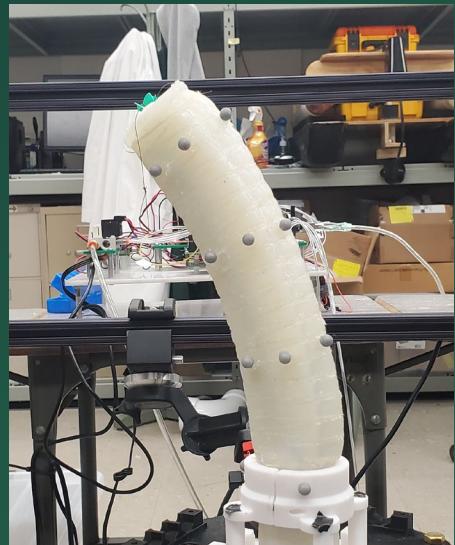


Safe handling of soft robot under actuation

# Challenges of Soft Robotics

- Difficult to control with high degree of freedom and nonlinearities
- High deformity under external forces and payload
- Variations in fabrication process produces nonuniform operation

How can a model account for these?



Soft manipulator before and after 100g payload was applied

Different shape when actuated with same control input on different chambers

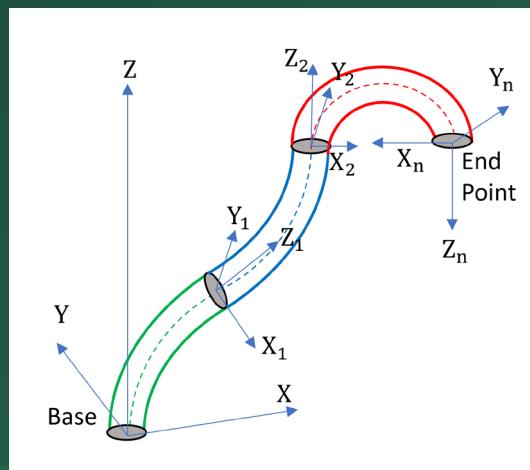
# Piecewise Constant Curvature Model

Individual segments of the manipulator are represented through arcs with a constant curvature

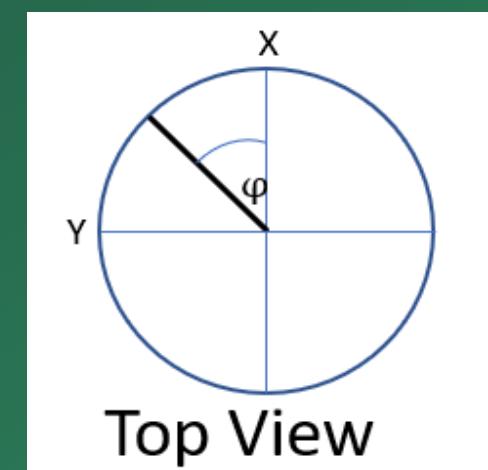
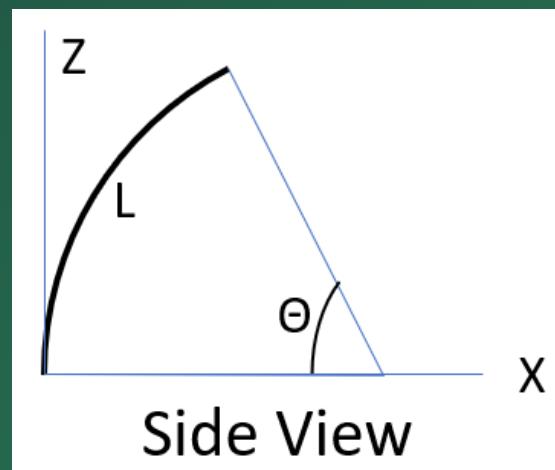
A single segment is described with three configurable variables:

$$[L, \theta, \varphi]$$

1.  $L$  is the overall length of the arc at the center
2.  $\theta$  is the magnitude of bending.
3.  $\varphi$  is the direction of bending



Piecewise Constant  
Curvature Representation



# Variable Curvature

With no external forces considered, soft robots can closely follow the PCC model. With external forces considered, a variable curvature can be utilized

$$k = \frac{d^2w}{dx^2} = \frac{1}{r} = \frac{\theta}{L}$$

$$k(s) = \frac{M(s)}{EI}, s \in [0, L]$$

$k$  is the curvature

$s$  is a parametric variable along the arc length of the manipulator

$M$  is the moment experienced at  $s$  on the manipulator

$EI$  is the bending stiffness of the arm as a function of young's modulus and the second moment of inertia

# Shape Reconstruction

With known curvature, the shape can be reconstructed as functions of the bending curvature and bending direction. With the shape, two types of external forces are considered

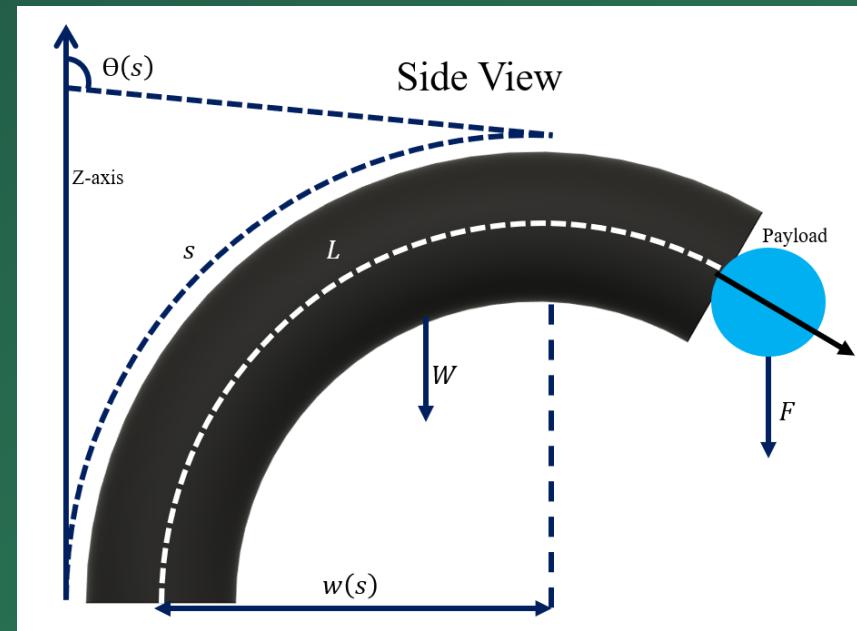
## 1. The weight of the manipulator

$$M(s) = \int_s^{L_c} \frac{W}{L_c} * \sin(\theta(s)) [w(L_c) - w(s)] ds,$$

$$w(s) = \int_0^s \sin(\theta(s)) ds, \quad \theta(s) = \int_0^s k(s) ds$$

## 2. A payload on the manipulator

$$M(s) = F * \sin(\theta(s)) * [w(L_c) - w(s)]$$

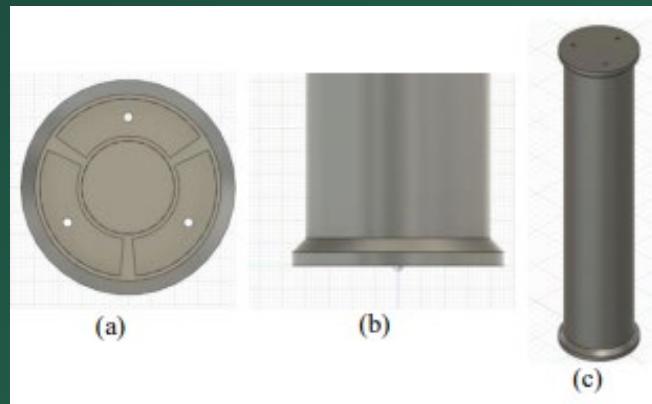


# Design of Soft Robot

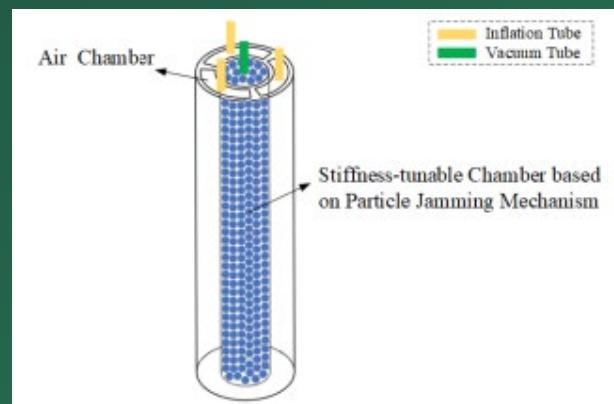
Robot used in this work is a silicone body, pneumatically actuated soft robot.

- Three air chambers evenly separated for bending actuation
- Central chamber filled with granular material to act as a stiffness tuning device

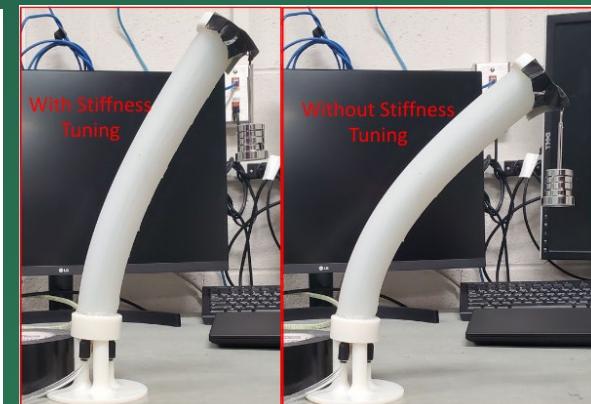
Based on this design a model for the length, moment, and stiffness is needed.



CAD of soft robot



Stiffness tuning diagram

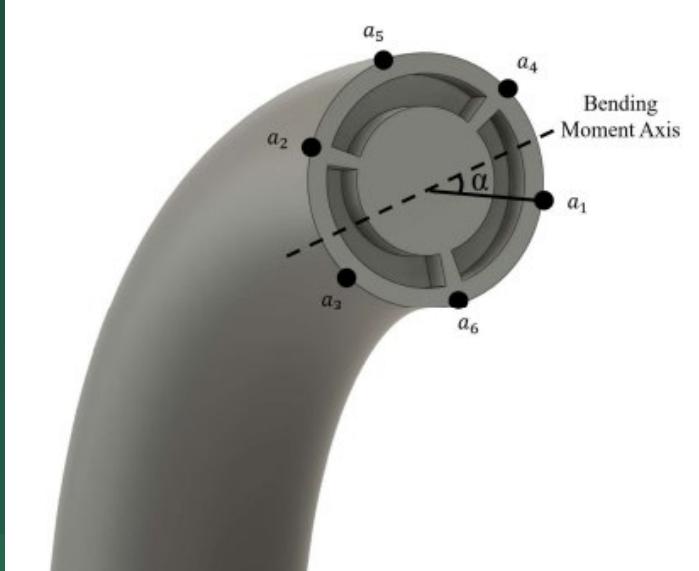


Stiffness tuning effect

# Length Modeling

Length of the manipulator changes under actuation. Under pressure inputs  $P = [P_1, P_2, P_3]$ , the robot increases in length enough to significantly alter the tip position.

$$\Delta L(\alpha) = P_1 \left[ a_1 + a_2 + (a_1 - a_2) \cos(\alpha) \right] + P_2 \left[ a_3 + a_4 + (a_3 - a_4) \cos\left(\alpha + \frac{2\pi}{3}\right) \right] + P_3 \left[ a_5 + a_6 + (a_5 - a_6) \cos\left(\alpha - \frac{2\pi}{3}\right) \right]$$



Length around circumference



Change in Length

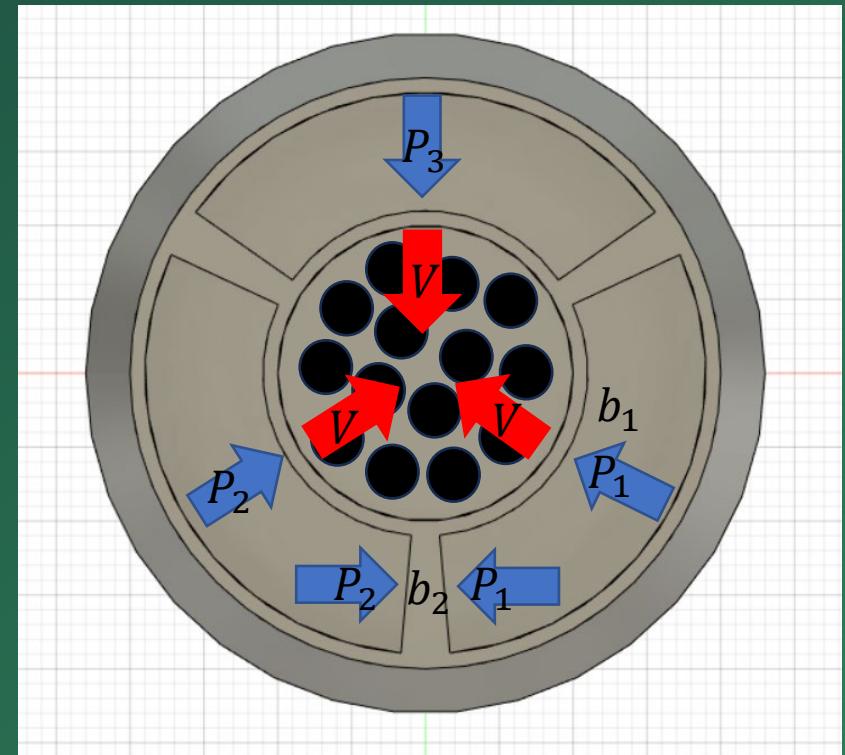
# Stiffness Modeling

Pressure between the air chambers and stiffness tuning device can create a variable stiffness

$$EI =$$

$$b_1 + b_2 \min(P) + b_3[V + \frac{1}{3} \text{sum}(P)]$$

- $b_1$  is the base stiffness
- $b_2$  is the stiffness generated by the antagonistic pressure
- $b_3$  is the stiffness generated by the stiffness tuning device
- $V$  is the vacuum pressure on the stiffness tuning chamber



Pressure Between Chambers

# Moment Modeling

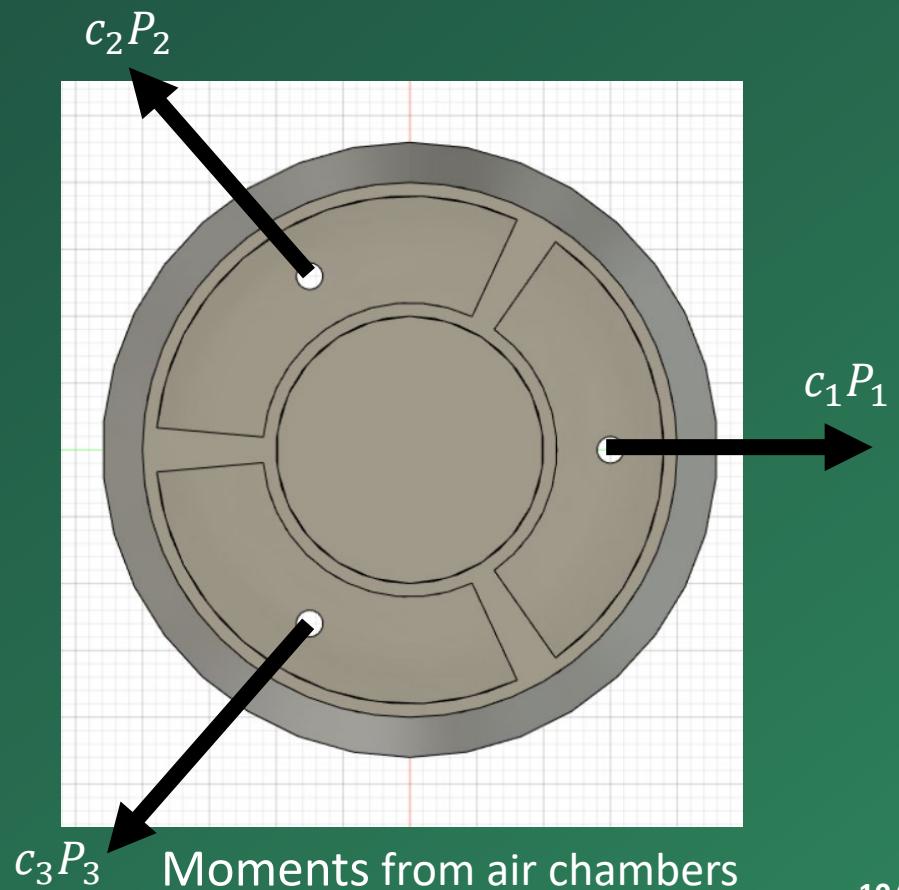
Each chamber generates a bending moment based on the pressure input. These values are unique enough to warrant individual parameters.

$$M_x = c_1 P_1 - \frac{1}{2} c_2 P_2 - \frac{1}{2} c_3 P_3$$

$$M_y = c_2 P_2 \frac{\sqrt{3}}{2} - c_3 P_3 \frac{\sqrt{3}}{2}$$

$$|M| = \sqrt{M_x^2 + M_y^2}$$

$$\angle M = \tan^{-1}(M_y/M_x) = \varphi$$

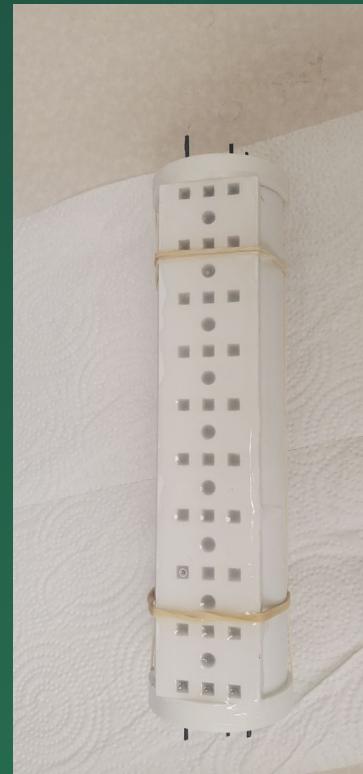


# Fabrication of Soft Robot

- 3D printed mold used for silicone casting with Dragon Skin™ 20
- Wax pieces used for internal air chambers for better sealing
- Fiber reinforcement with Kevlar thread to prevent bellowing



Wax Mold



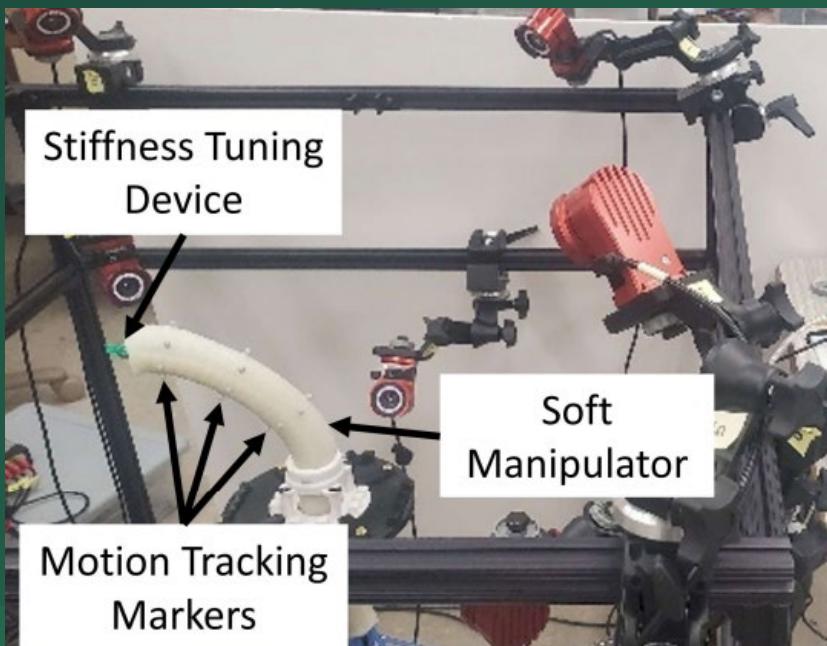
Robot Mold



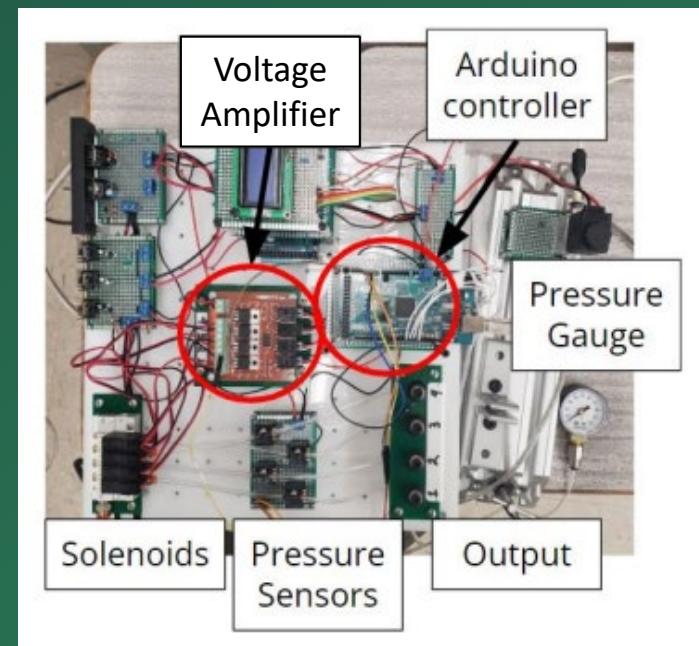
No Fiber reinforcement 11/18

# Experimental Setup

- Motion capture system used to capture position of the manipulator for its length and bending angle
- Difference in bending from before and after a payload is added is used to estimate the true stiffness
- Model was trained on 20 randomly generated control inputs



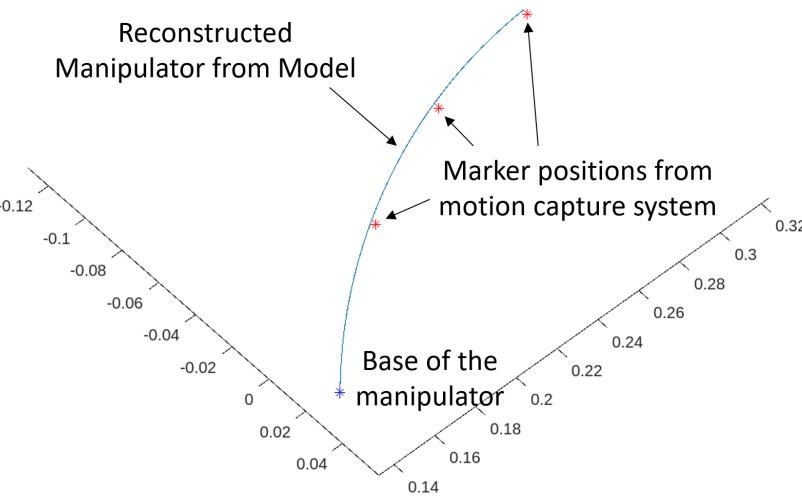
Motion Tracking System



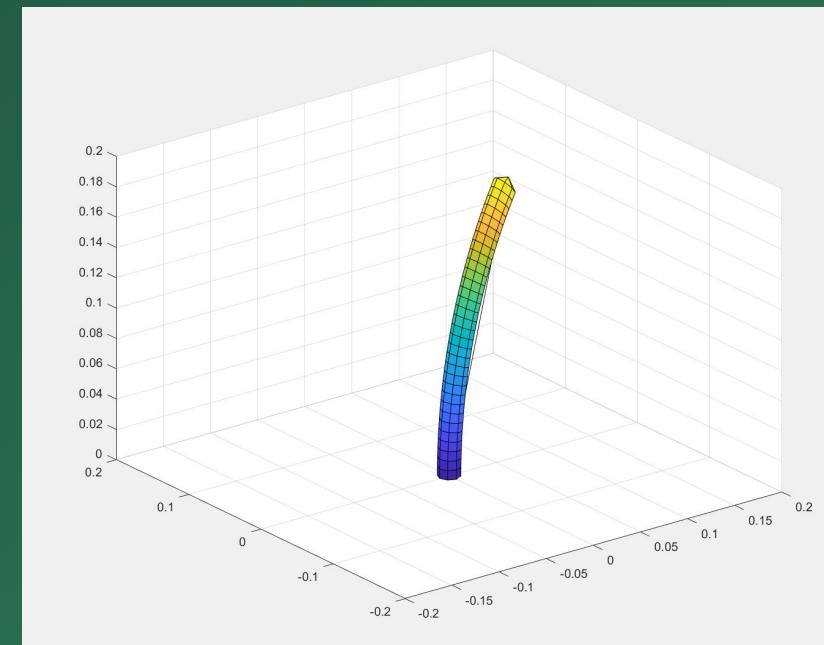
Pneumatic Control Board

# Data interpretation

With the parameters calculated using model, the shape of the manipulator can be reconstructed.

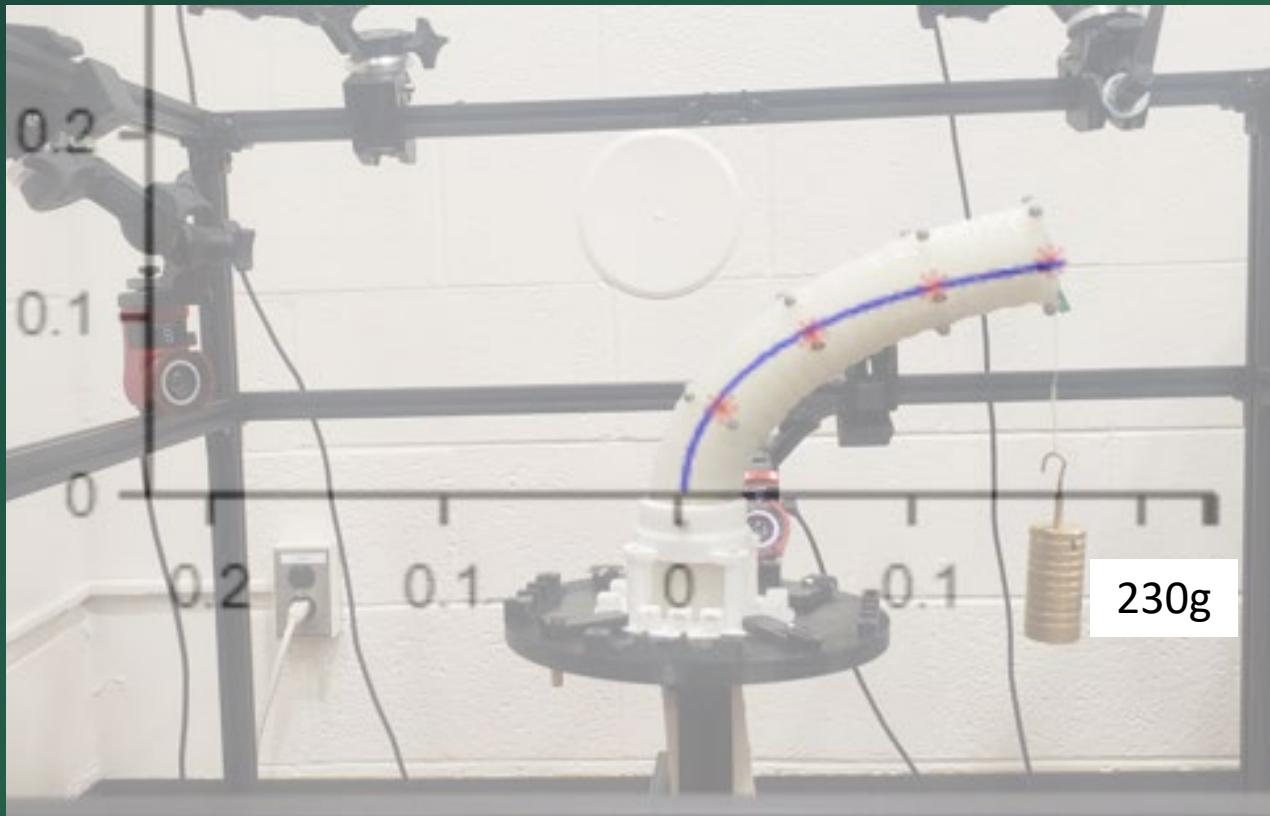


Marker Centroid vs  
Reconstructed shape



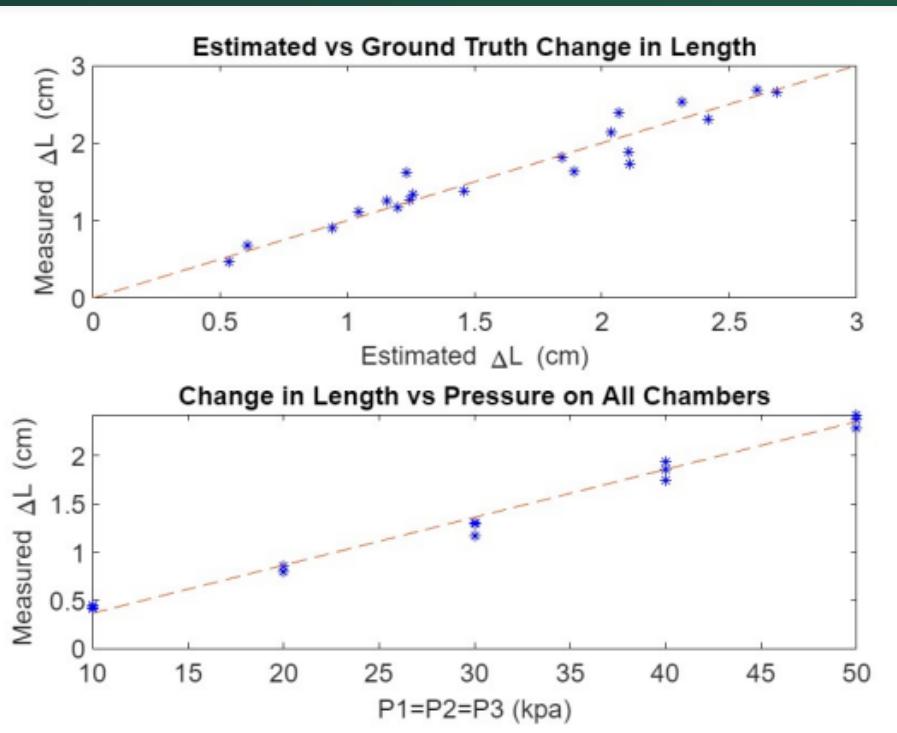
# Payload Input

With a known payload value, the shape of the manipulator can still be reconstructed with the estimated stiffness value

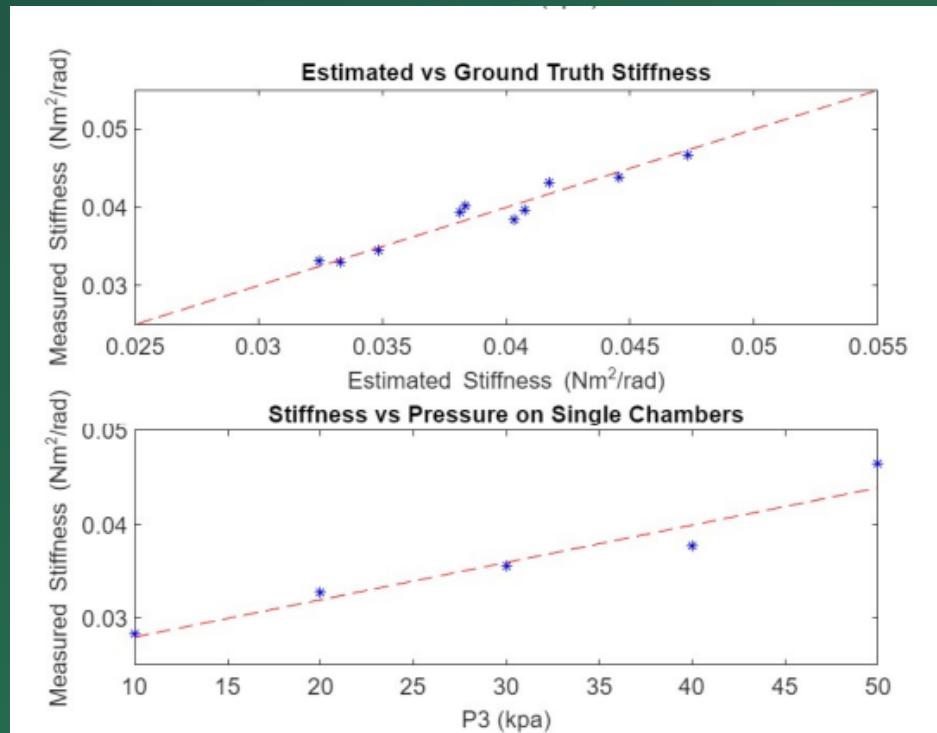


Overlay of reconstructed shape on actual robot

# Parameter Estimation Results



Length Results



Stiffness Results

# Shape reconstruction results

10 more random set of control inputs were generated and tested with the model that it was not trained on.

|               | Absolute (cm) | Percent |
|---------------|---------------|---------|
| Mean Error    | 0.85          | 4.49%   |
| Median Error  | 0.5           | 2.63%   |
| Maximum Error | 3.1           | 16.3%   |
| Minimum Error | 0.13          | 0.68%   |

# Conclusions and Future Work

## Conclusions

- Model able to accurately predict the length, moment, and stiffness of the manipulator
- Low error on predicting the shape of the manipulator

## Future Work

- Extend modeling work to account for multiple segments and nonlinearities
- Utilize control methods to move robot on a given trajectory with the model

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# Questions?