

# Novel *Sensing Mechanisms* for Medical Robotics

July 21, 2014

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Assistant Professor

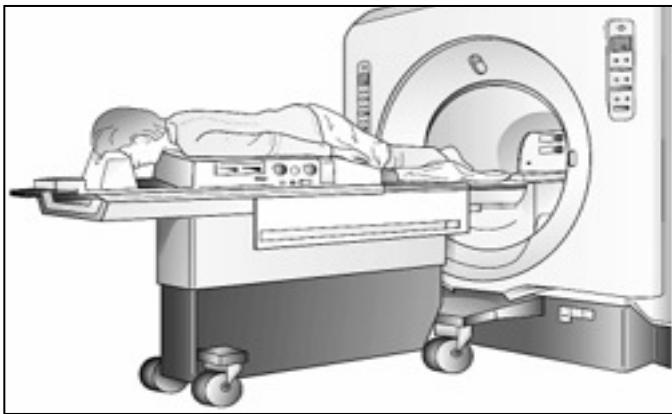
*Robotics Institute, School of Computer Science*  
*Carnegie Mellon University*

**Soft Robotics and Bionics Lab.**  
(<http://softrobotics.cs.cmu.edu>)

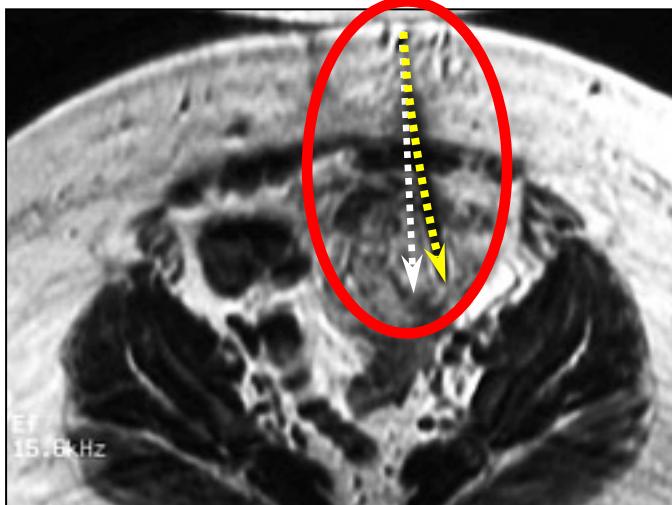
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- **MRI-Compatible Shape Sensing Interventional Tools**
  - MRI-Compatible Robotic End-Effector
  - Soft Sensors
  - Soft Actuators

# Background

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MRI Core Breast Biopsy (*Image from <http://www.uwhealth.org>*)



MRI of needle puncturing an abscess in the pelvis.

- **MRI-Guided Interventional Procedures**
  - MR Guided Biopsy
  - Lesion Localization
  - Tumor Ablation
  - Therapeutic Injection
  
- **Problems:**
  - Needle Deflection
  - Lack of sensing capability

# Goal: Detection of Needle Deflection

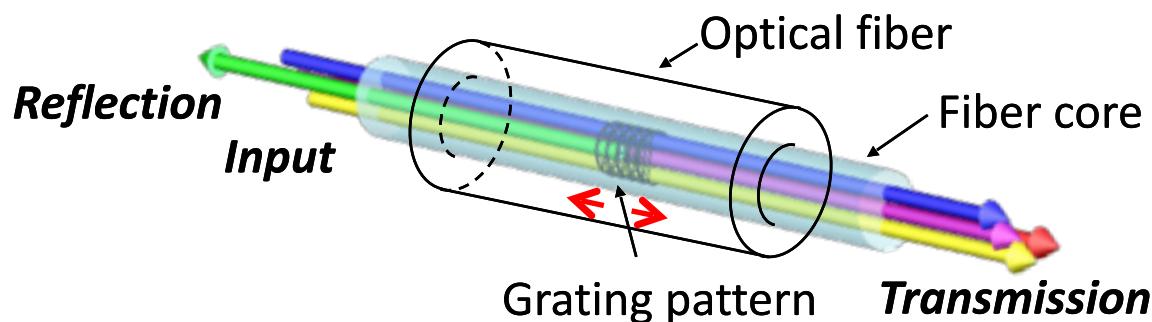
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- Existing Technologies
  - MR Tracking
  - Rapid MRI
  - Gradient-based Tracking
- Objective: MR-Haptics
  - Real-time sensing of needle deflection and bend-shape
  - Strain sensing approach

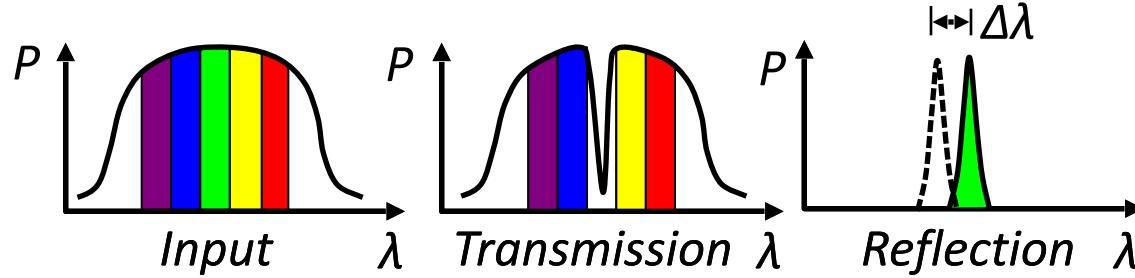
# Fiber Bragg Grating (FBG) Sensors (1)

## Fiber Bragg Grating Sensor

- optic strain sensor



- Light, small, and flexible
- Electrically passive
- Multiplex / de-multiplex
- High resolution ( $0.1 \mu\epsilon$ )
- High accuracy ( $1 \mu\epsilon$ )



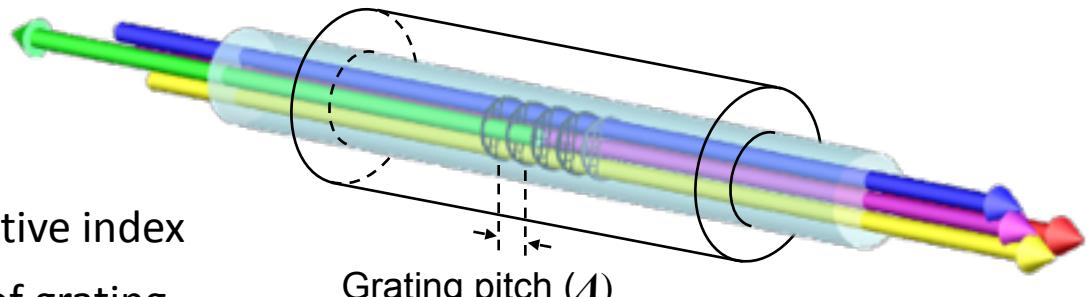
K. O. Hill and G. Meltz, "Fiber Bragg grating technology fundamentals and overview," *J. Lightwave. Technol.*, 15(8): 1263–1276, 1997.

# Fiber Bragg Grating (FBG) Sensors (2)

- Bragg wavelength:

$$\lambda_B = 2n_{eff}\Lambda$$

$n_{eff}$ : effective refractive index  
 $\Lambda$  : spatial period of grating



- **Strain** and **temperature** dependent:  $1.2 \text{ pm}/\mu\varepsilon, 10 \text{ pm}/^\circ\text{C}$

$$\Delta\lambda_B/\lambda_B = (1 - p_\varepsilon)\varepsilon + (\alpha_A - \alpha_N)\Delta T$$

$\varepsilon$  : strain

$\Delta T$  : temperature change

$p_\varepsilon$  : strain optic coefficient

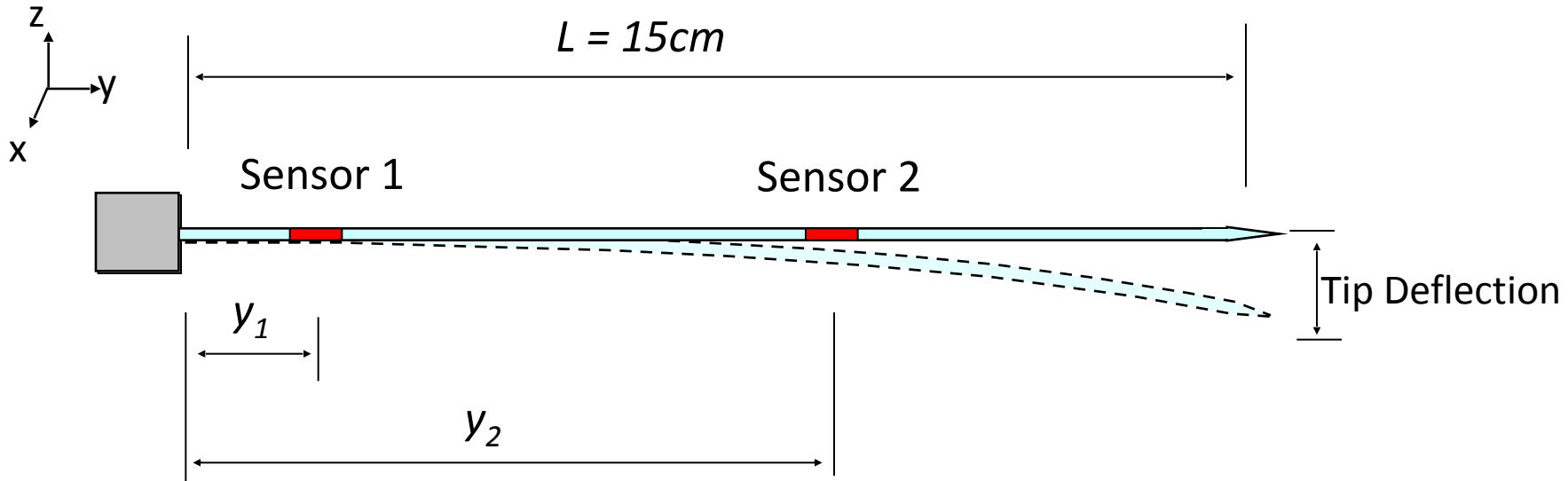
$\alpha_A$  : thermal expansion coefficient of fiber

$\alpha_N$  : thermal optic coefficient

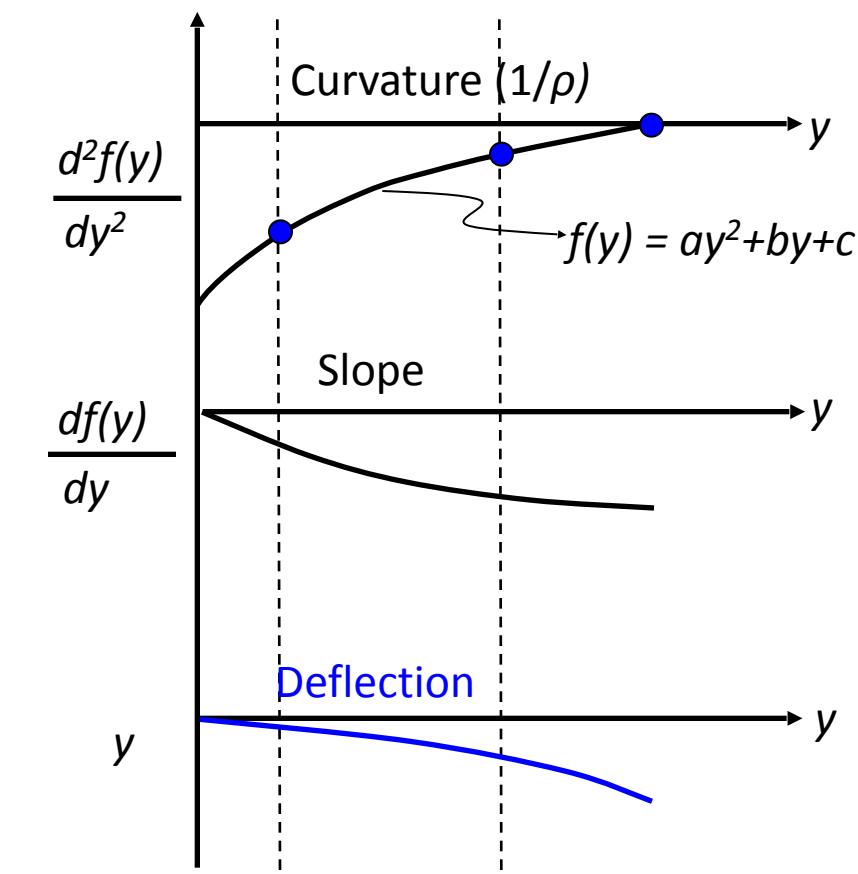
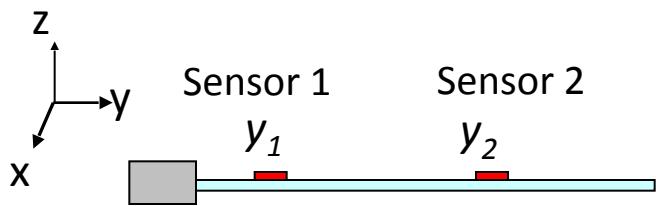
# Model Construction

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- MRI-compatible biopsy needle  
*(MR1815, E-Z-EM Inc, Westbury, NY)*
  - 18 ga x 15 cm
  - Material: Inconel 625 alloy



# Deflection Estimation using Beam Theory



$\varepsilon_n$ : strain measured by FBG sensor  
 $\rho$ : radius of curvature  
 $d$ : distance from neutral axis

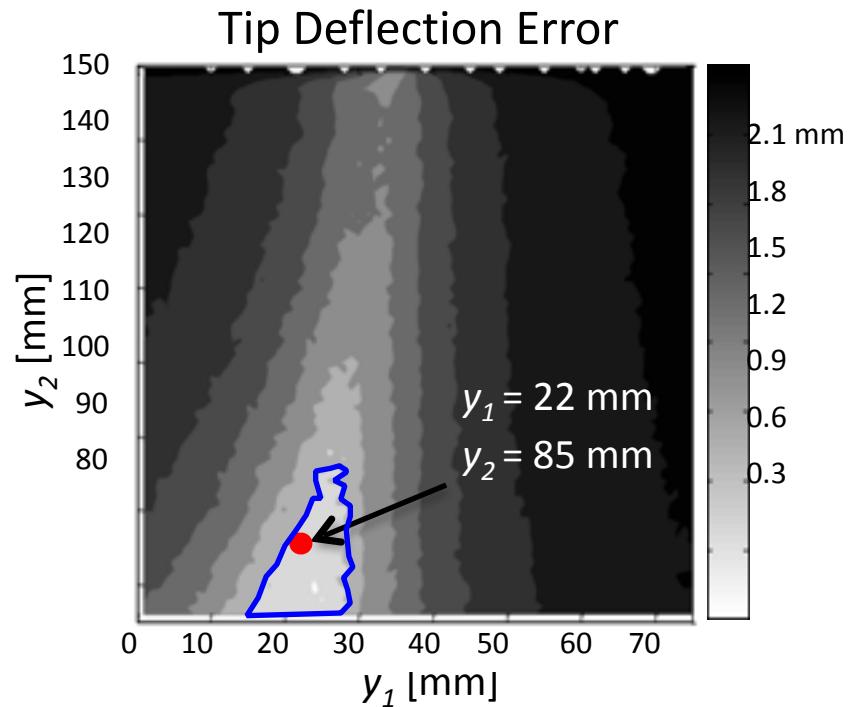
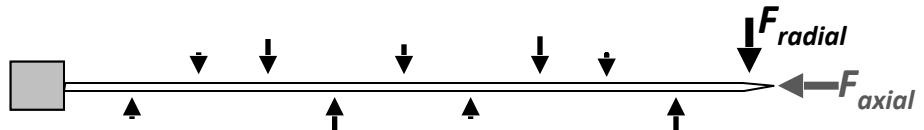
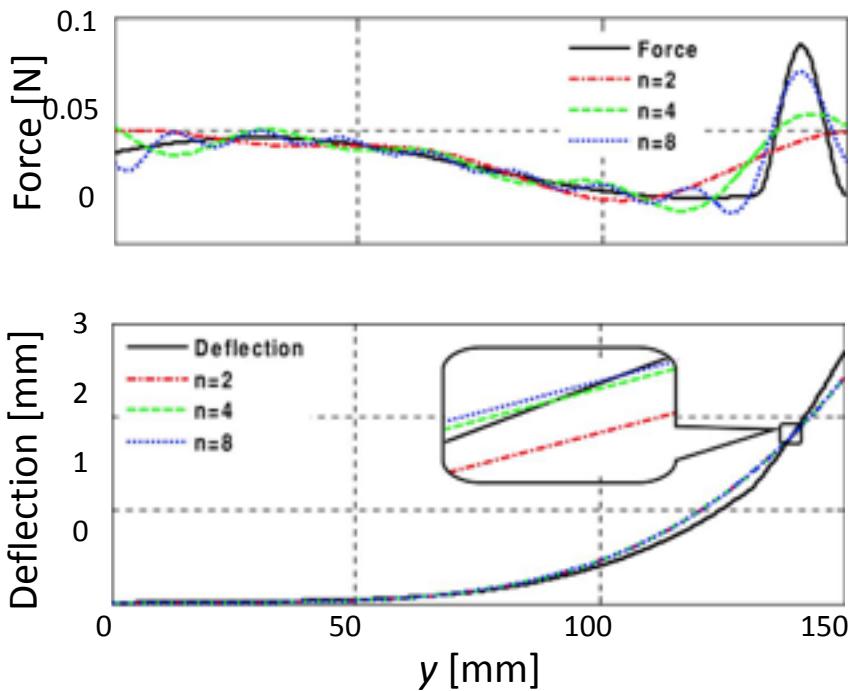
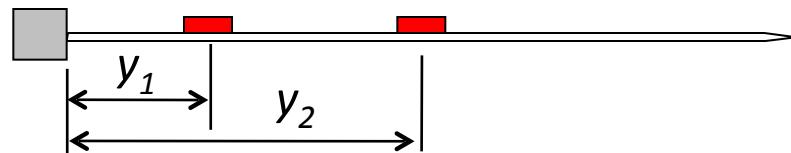
$$\text{Curvature} = \frac{1}{\rho} = \frac{\varepsilon_n}{d}$$

$$\text{Slope} = \int f(y) \, dx$$

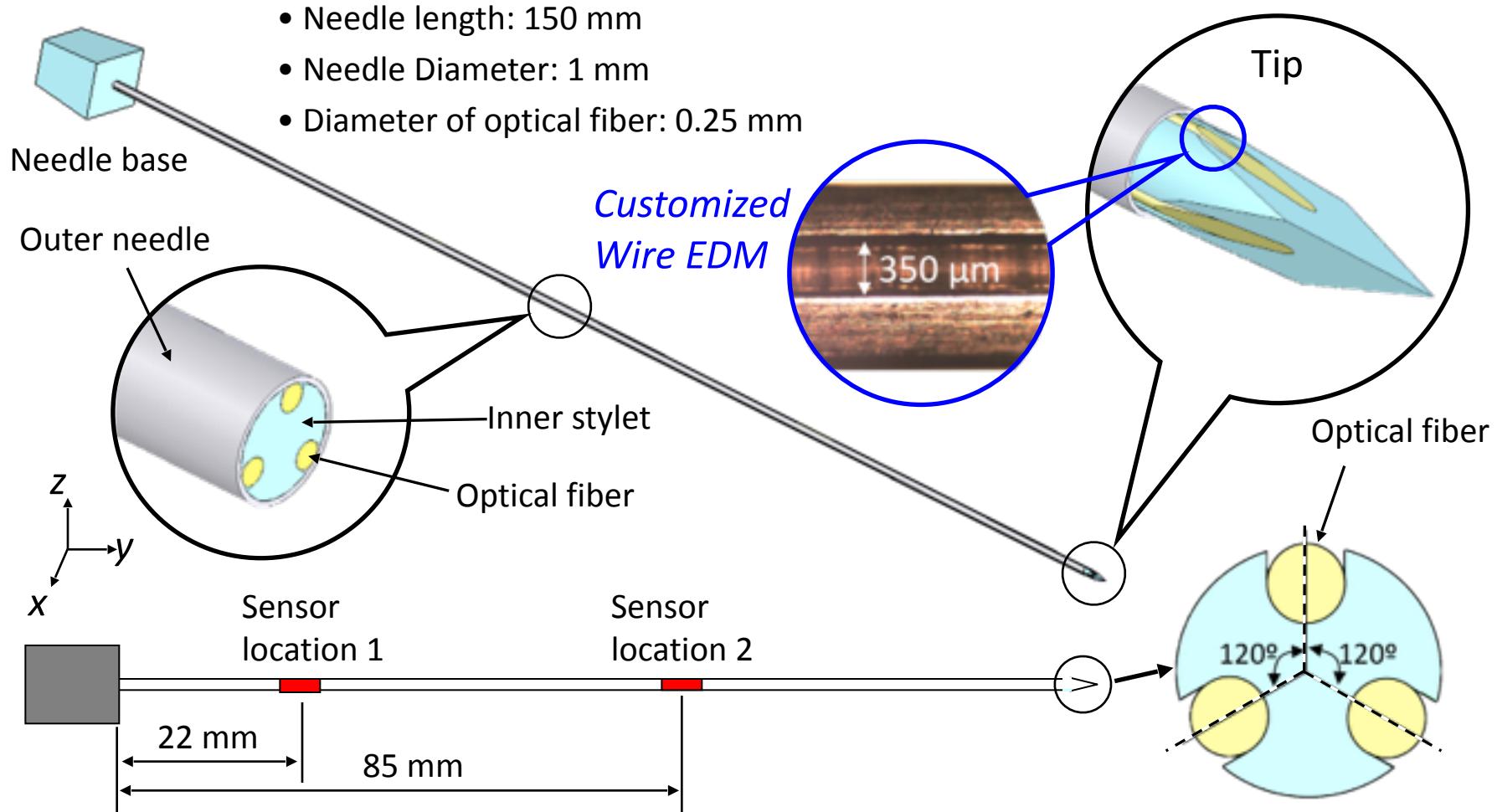
$$\text{Deflection} = \iint f(y) \, dx$$

# Sensor Placement

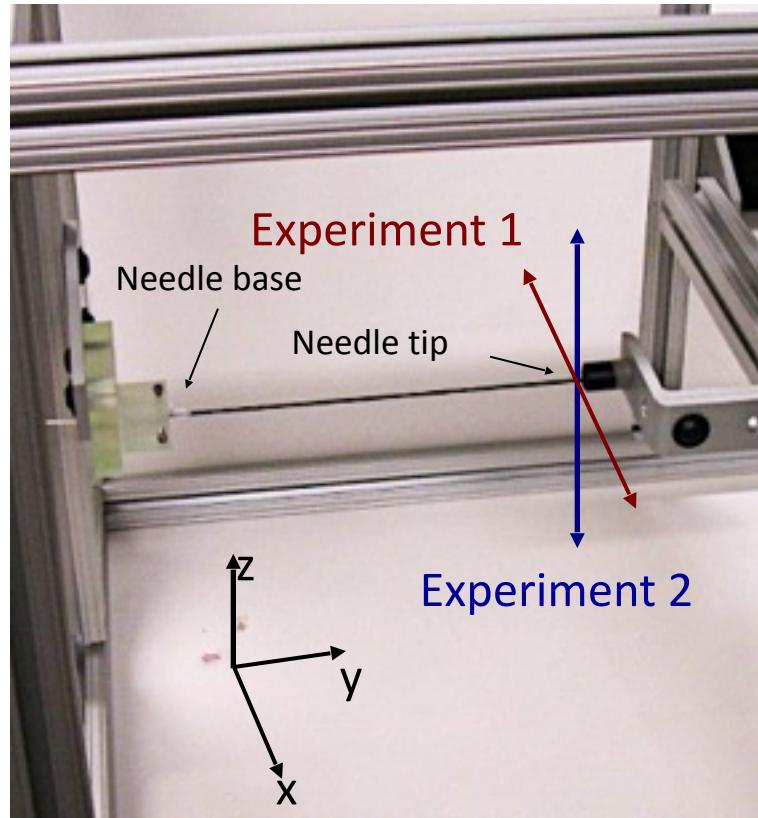
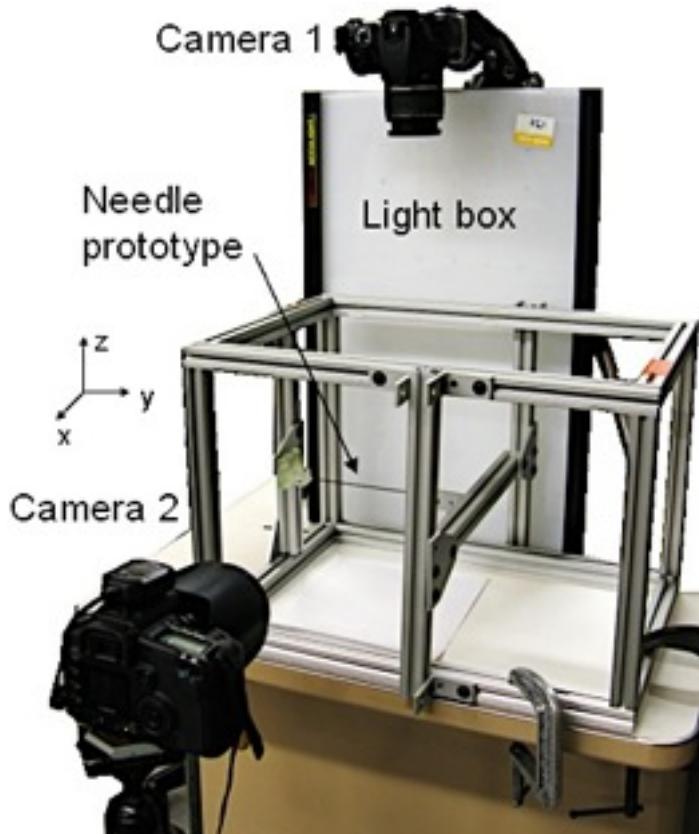
$L=150 \text{ mm}$ ,  $\Phi=1 \text{ mm}$



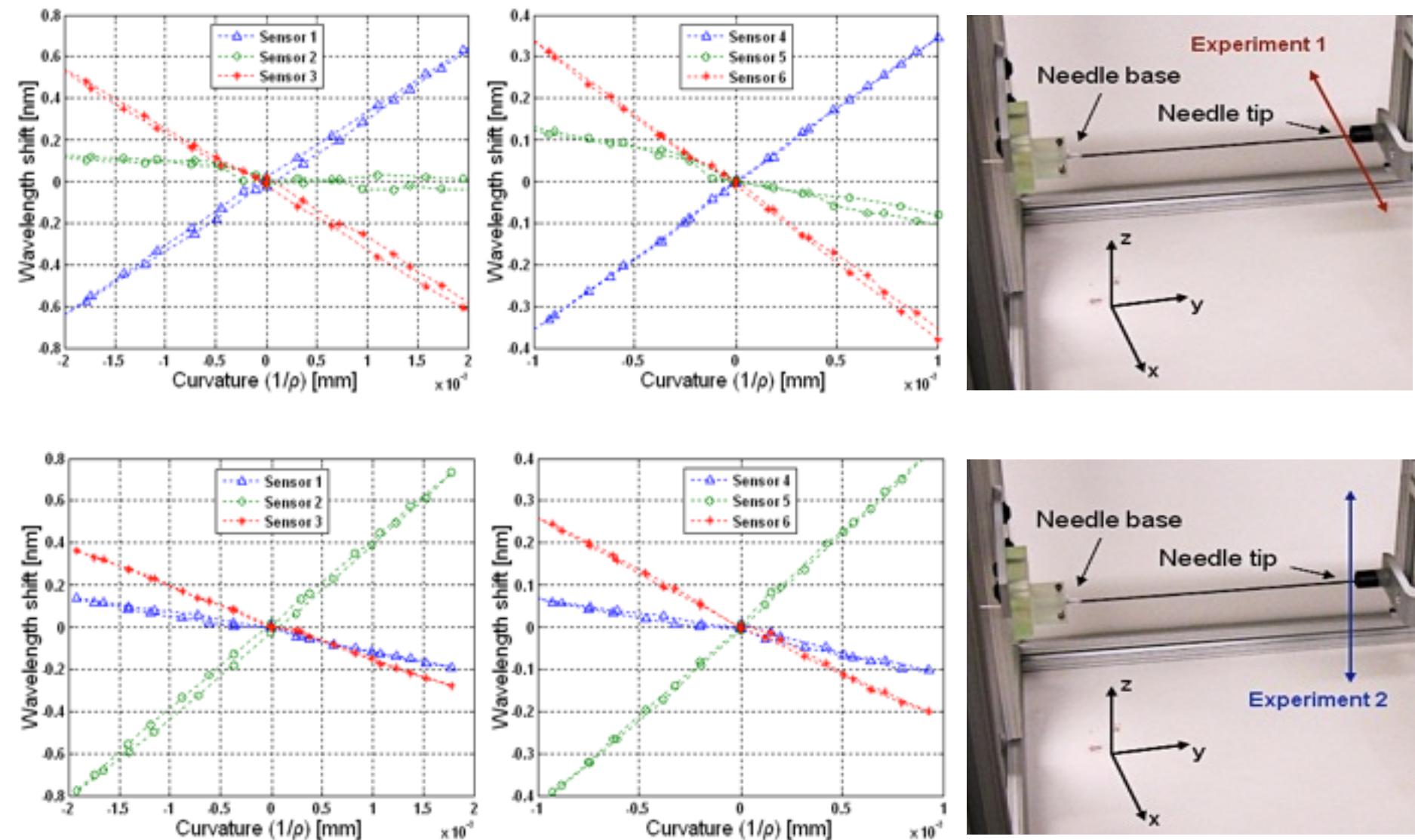
# Prototype Design



# Sensor Calibration



# Calibration: $\Delta\lambda$ vs. Curvature



# Calibration: $\Delta\lambda$ vs. Curvature

$$\delta y_n = \delta s_n \cdot C_n$$

$$\delta y_n = [k_{xy} \ k_{yz} \ \Delta t]$$

$$\delta s_n = [\Delta\lambda_1 \ \Delta\lambda_2 \ \Delta\lambda_3]$$

Moore-Penrose pseudo inverse  
with a weight matrix

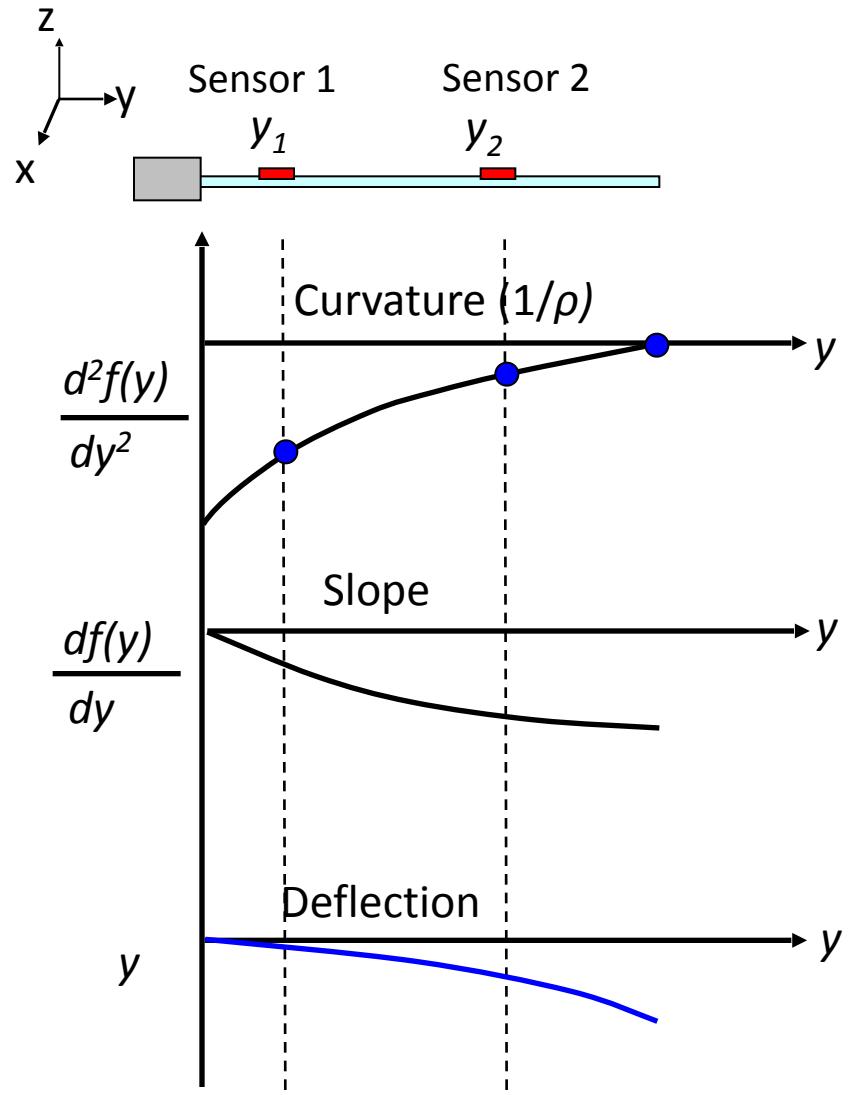
$$C_n = [\delta s^T W \delta s]^{-1} \delta s^T W \cdot \delta y_n$$

$C_n$ : Calibration matrix at sensor location  $n$

$k_{xy}$  (*or*  $k_{yz}$ ): Local curvature in  $xy$ - (*or*  $yz$ -) plane

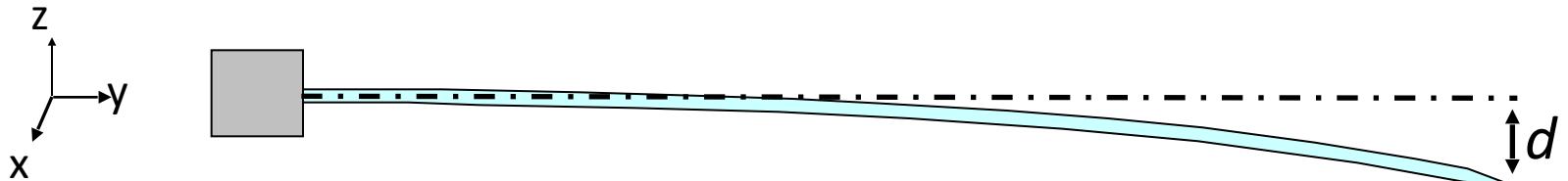
$\Delta t$ : Temperature change

$\Delta\lambda_i$ : Wavelength shift of sensor  $i$



# Results: $\Delta\lambda$ vs. Curvature

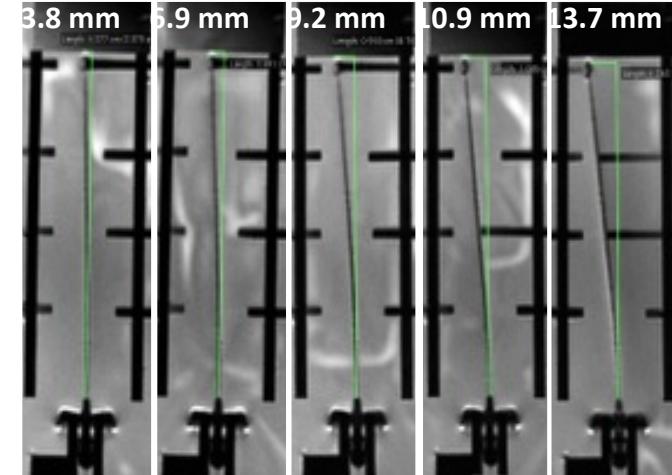
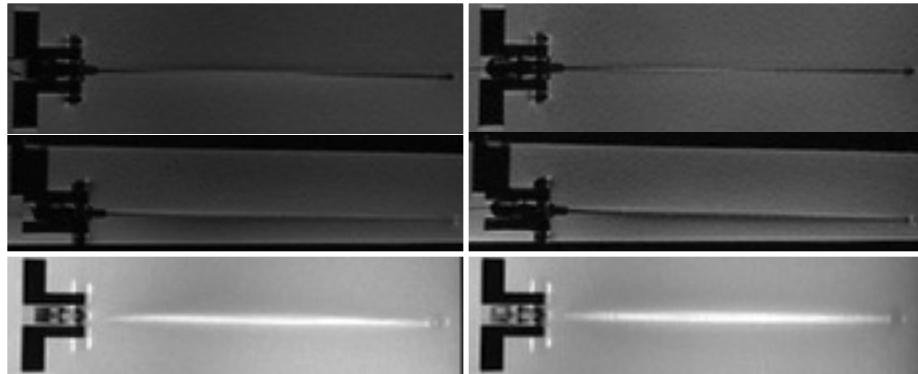
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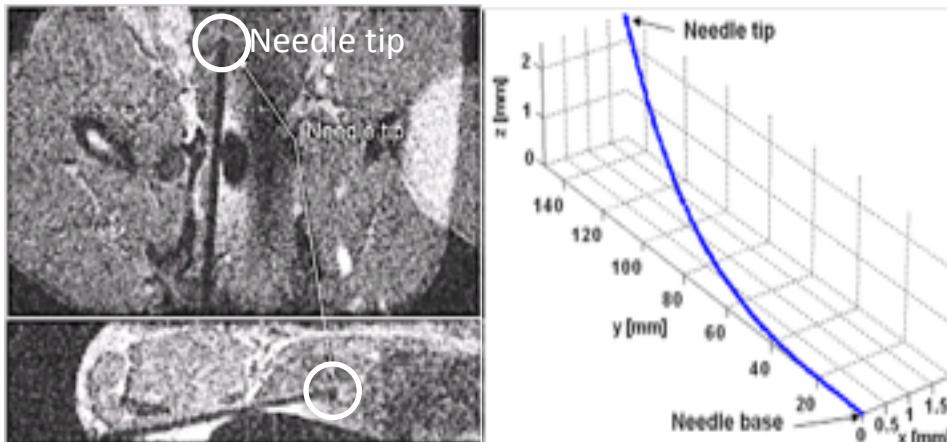
Deflection Range (mm)	$-7 \leq d \leq 7$	$-10 \leq d \leq 10$	$-15 \leq d \leq 15$
Error RMS (xy)	0.35	0.38	0.38
Error RMS (yz)	0.26	0.26	0.28

# MRI Scanner Tests

Without Sensor      With Sensor

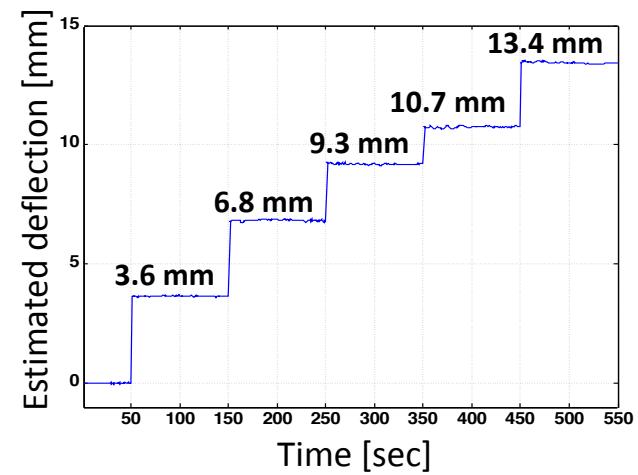


In-Vivo Animal Test



Clinical Collaboration:

Bruce Daniel, MD, Radiology, Stanford Medical Center



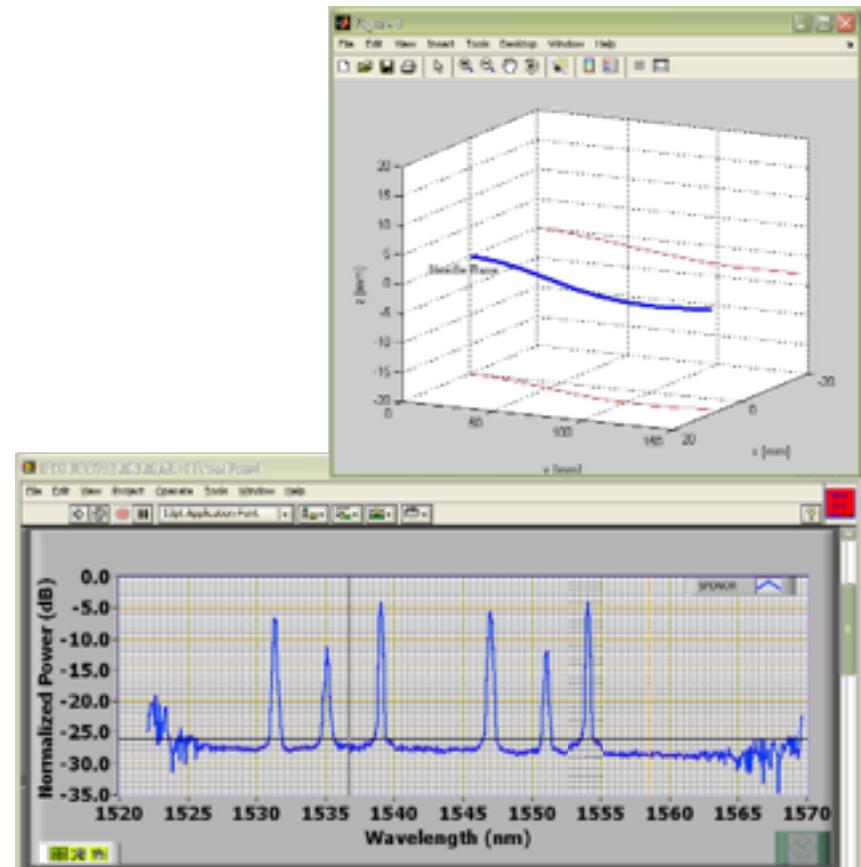
# Real-Time Monitoring System



**Video Link:**

<http://www.youtube.com/watch?v=m1MR9QtOU4o>

MATLAB window for showing  
**3D Needle Shape** in real-time



LabView window showing **Wavelength Shifts**

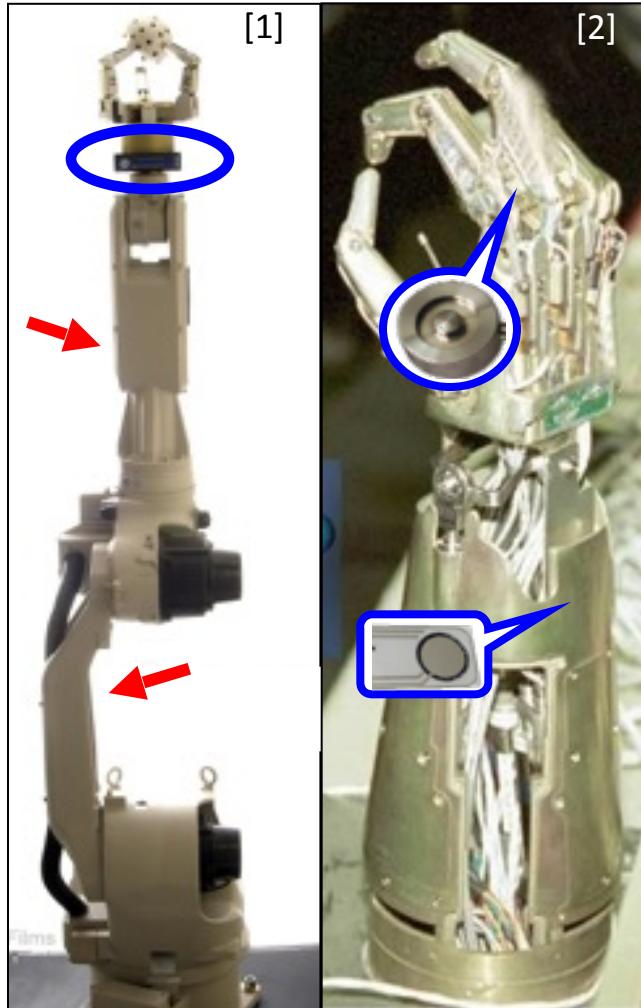
# Summary

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- MRI-Compatible Shape Sensing Biopsy Needle
- Objective:
  - Instrumentation of MRI-compatible biopsy tools.
- Solution:
  - Embedded fiber optic sensors with customized EDM.
- Results:
  - Tip position error:  $\approx 0.3$  mm
  - Completely MRI-safe
- Publications:
  - **YL Park**, S Elayaperumal, B. Daniel et al., “Real-Time Estimation of 3-D Needle Shape and Deflection for MRI-Guided Interventions,” *IEEE/ASME Transactions on Mechatronics*, Vol 15, No 6, 2010.
  - S Elayaperumal, J Plata, A Holbrook, **YL Park**, MR Cutkosky et al. , “Autonomous real-time interventional scan plane control with a 3-D shape-sensing needle.” *IEEE Transactions on Medical Imaging*, 2014.
  - **YL Park**, S Elayaperumal, MR Cutkosky et al., “MRI-compatible Haptics: Strain sensing for real-time estimation of three dimensional needle deflection in MRI environments,” *ISMRM 2009* (oral presentation), April 2009.
  - **YL Park**, S Elayaperumal, MR Cutkosky et al., “MRI-compatible Haptics: Feasibility of using optical fiber Bragg grating strain-sensors to detect deflection of needles in an MRI environment,” *ISMRM 2008* (oral presentation), May 2008.

- 
- MRI-Compatible Shape Sensing Interventional Tools
  - **MRI-Compatible Robotic End-Effectors**
  - Soft Sensors
  - Soft Actuators

# Force Sensing for Dexterous Manipulation



- Industrial Robot
  - 3 or 6 axis force-torque sensors
  - Sufficient for routine and expected tasks
  - No unexpected events allowed
- ROBONAUT (NASA)
  - Load cells and force sensitive resistors
- Limitations:
  - Electromagnetic interference
  - Complicated circuits and wiring
  - Limited area sensing
- Need a **new approach to force sensing**

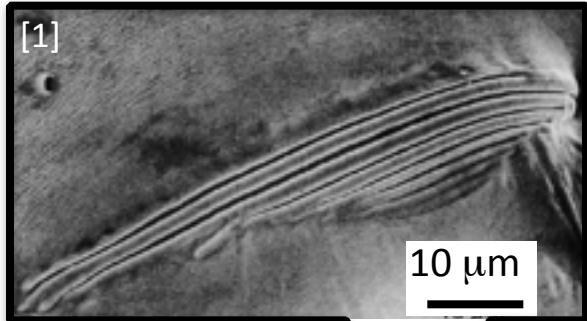
[1] <http://www.gdl.cinvestav.mx/~edb/images/Barret-arm.jpg>

[2] Robonaut <<http://robonaut.jsc.nasa.gov/robonaut.html>>

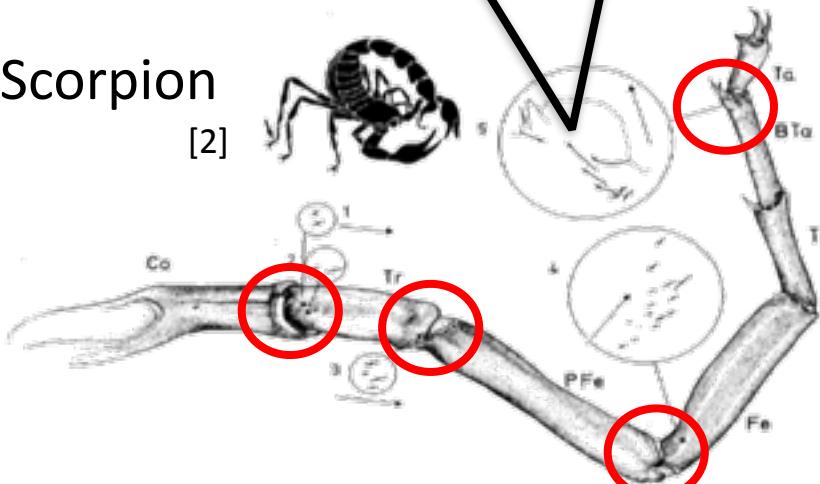
# Biological Strain Sensors

## Bio-Inspiration

**Slit Sensilla:** biological strain sensors  
in exoskeletons (e.g. spiders, lobsters etc.)



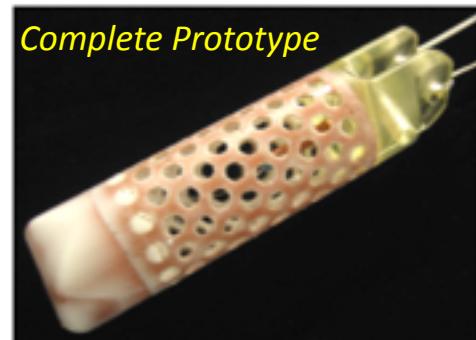
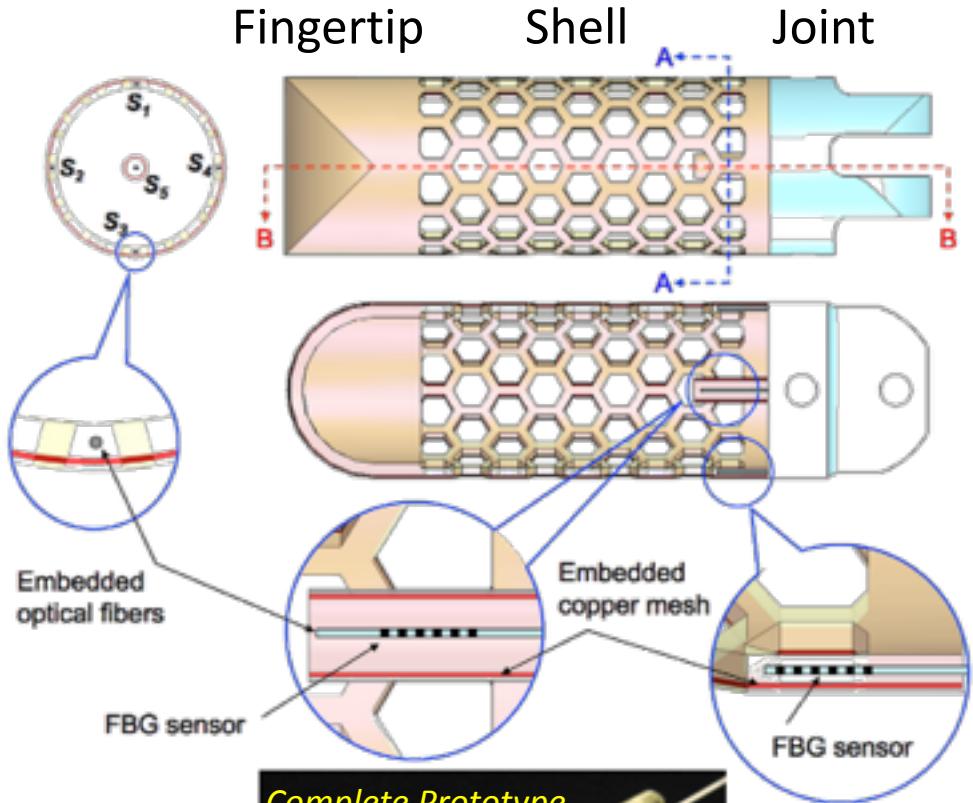
## Scorpion



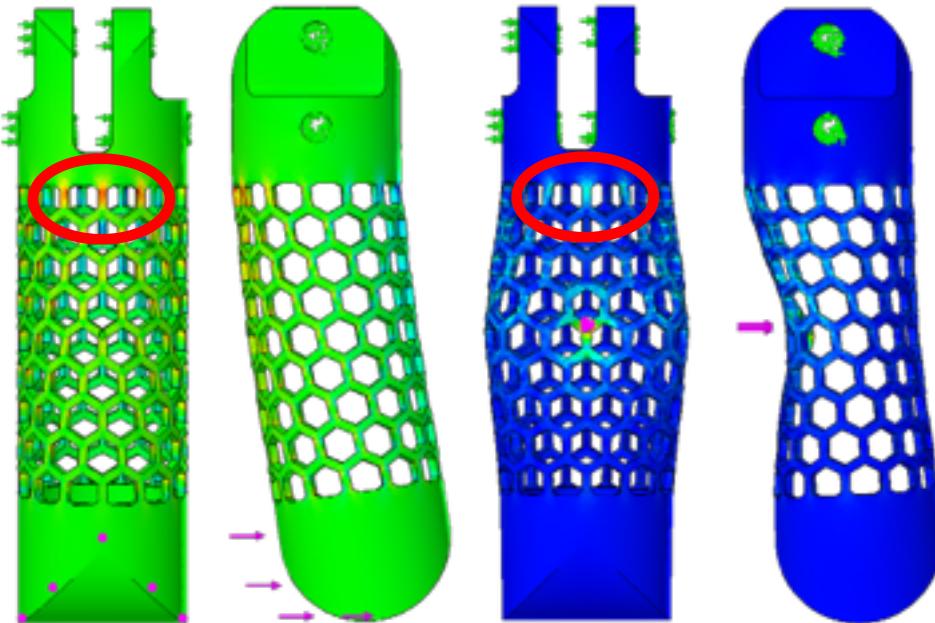
[1] FG Barth and M Wadepuhl. *J. Morphol.*, 145(2): 209-227, 1975.

[2] FG Barth, *Zoomorphologie*, 86:1-23, 1976

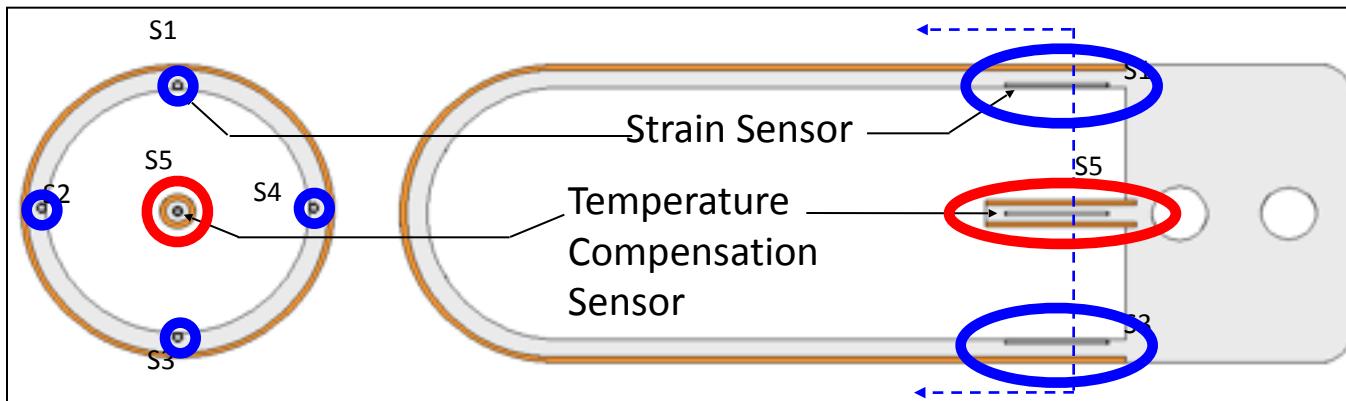
**Design:** sensor embedded exoskeleton



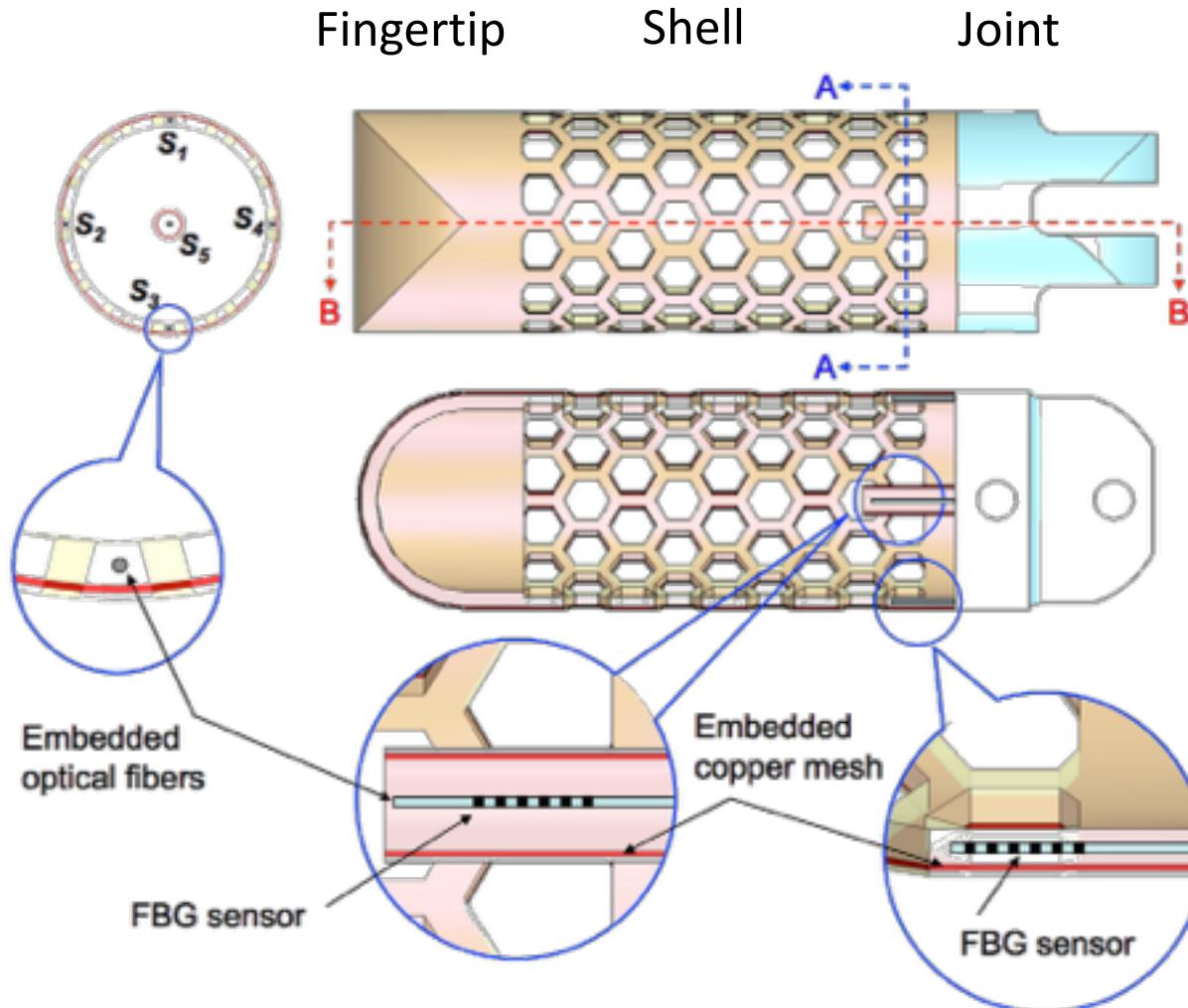
# Sensor Configuration



- Strains are mostly concentrated on the top of the shell
- **Four strain sensors** at 90° interval (first rib of the shell)
- One temperature compensation sensor in the middle

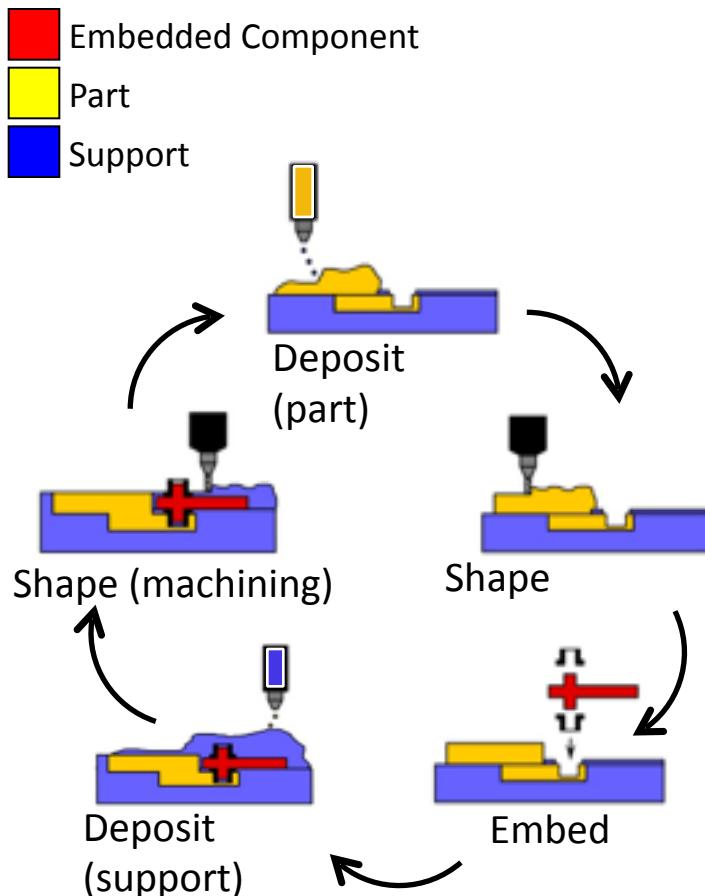


# Fabrication Challenge



- Hollow structure
- Hexagonal shell patterns
- Embedded copper mesh
- Embedded optical fibers

# Shape Deposition Manufacturing (SDM)



- Easy to build multi-material structure
- Easy to build multiple parts with different shapes at the same time
- Easy to embed different parts during the fabrication
- ***Limitations:***
  - Hard to make a hollow structure
  - Hard to make a fully 3D part

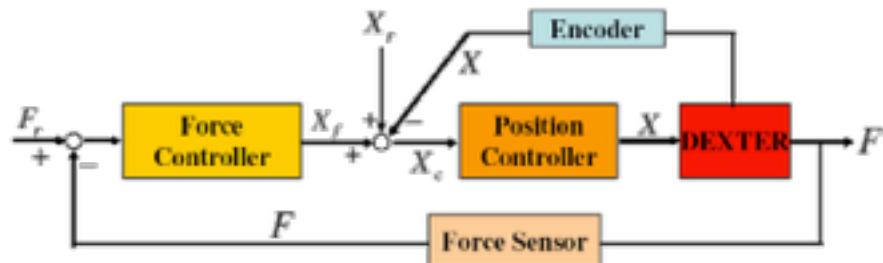
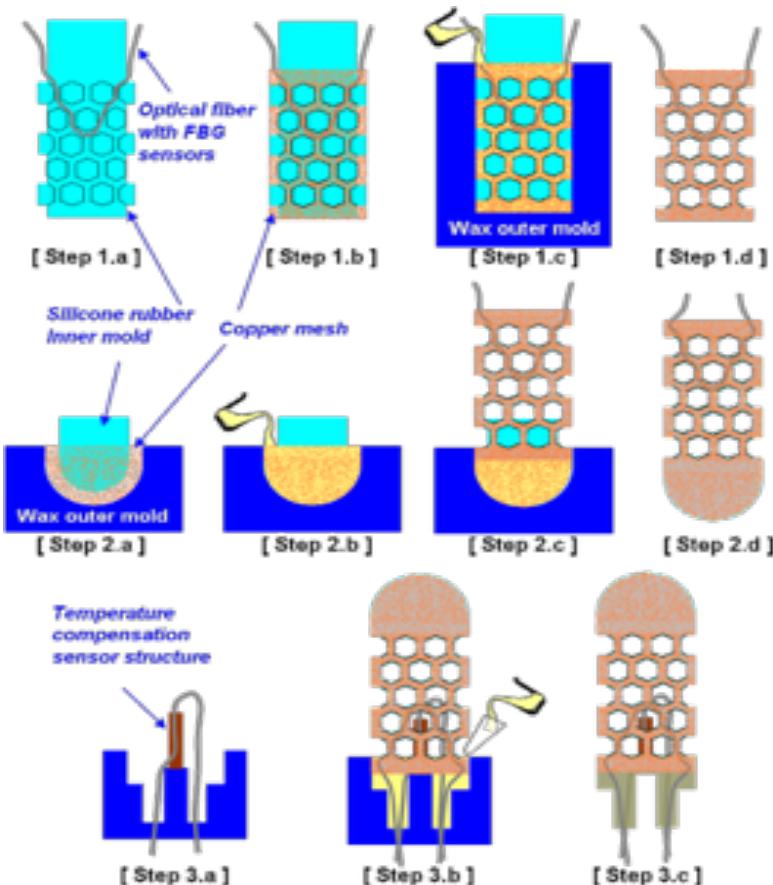
LE Weiss, R Merz FB Prinz et al., “Shape deposition manufacturing of heterogeneous structures,” J. Manuf. Syst., 16(4): 239-248, 1997.

SA Bailey, JG Cham, MR Cutkosky, et al., “Biomimetic Robotic Mechanisms via Shape Deposition Manufacturing,” 9th Int. Symp. Rob. Res., 1999.

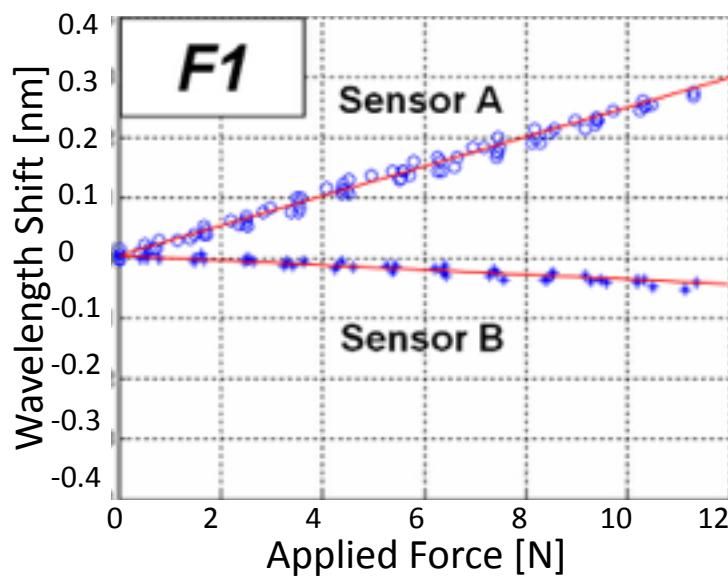
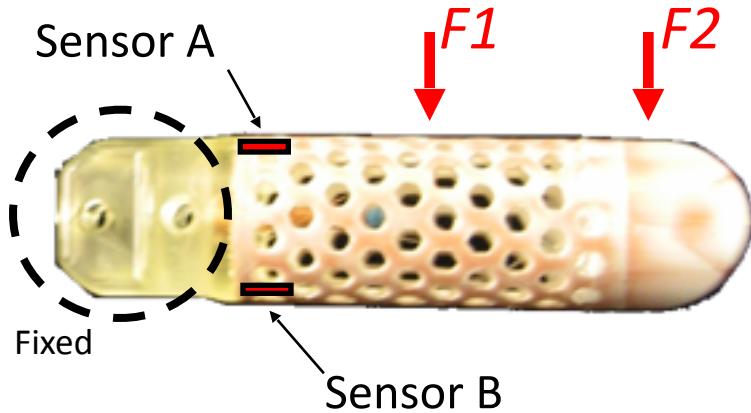
# New Manufacturing Method – Modified SDM

**Manufacturing:** Low cost, fast turn-around polymer manufacturing with embedded sensors

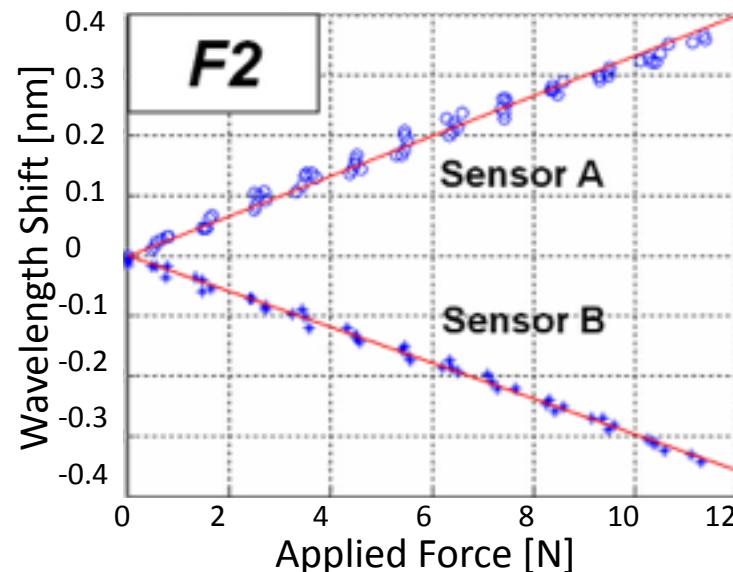
**Sensor-Integrated Control:**  
Nonlinear feedback force/position control



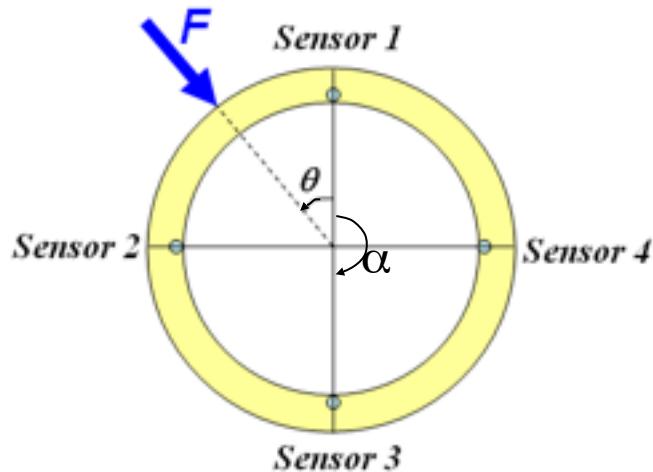
# Force Calibration



- *Shell ( $F_1$ )*
  - Sensitivity: 0.024 nm/N
  - Detectable force change: < 0.03 N
  - Practical resolution: 0.1 N
- *Fingertip ( $F_2$ )*
  - Sensitivity: 0.032 nm/N
  - Detectable force change: < 0.02 N
  - Practical resolution: 0.15 N

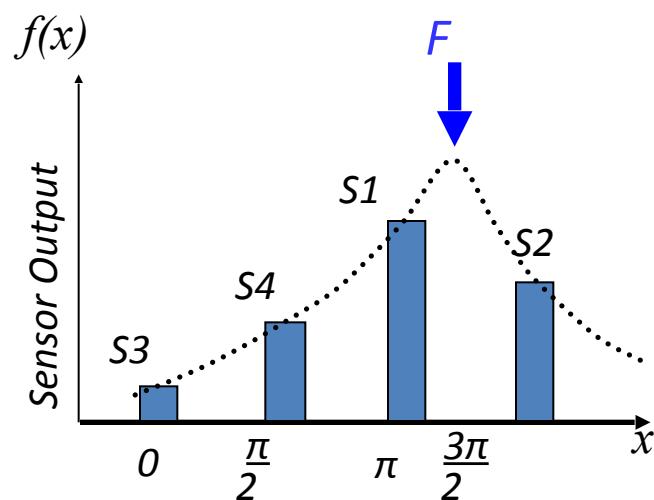


# Latitudinal Location



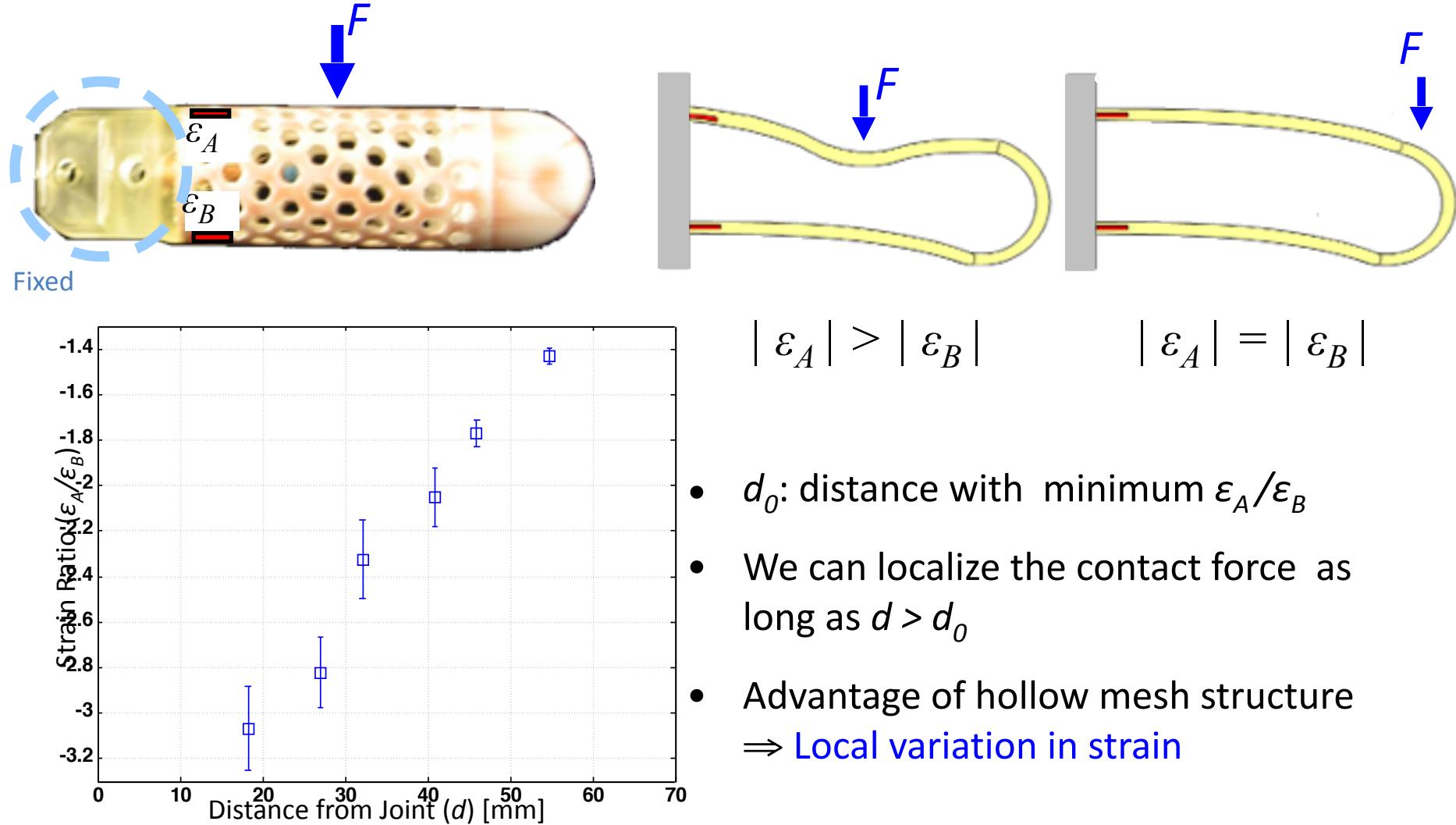
- Use **centroid method** to find the latitudinal location

$$\begin{aligned}\theta &= \frac{\sum x \cdot f(x)}{\sum f(x)} - \alpha \\ &= \frac{0 \cdot (S3) + \pi \cdot (S4) + 3\pi/2 \cdot (S1) + 2\pi \cdot (S2)}{S3 + S4 + S1 + S2} - \alpha\end{aligned}$$



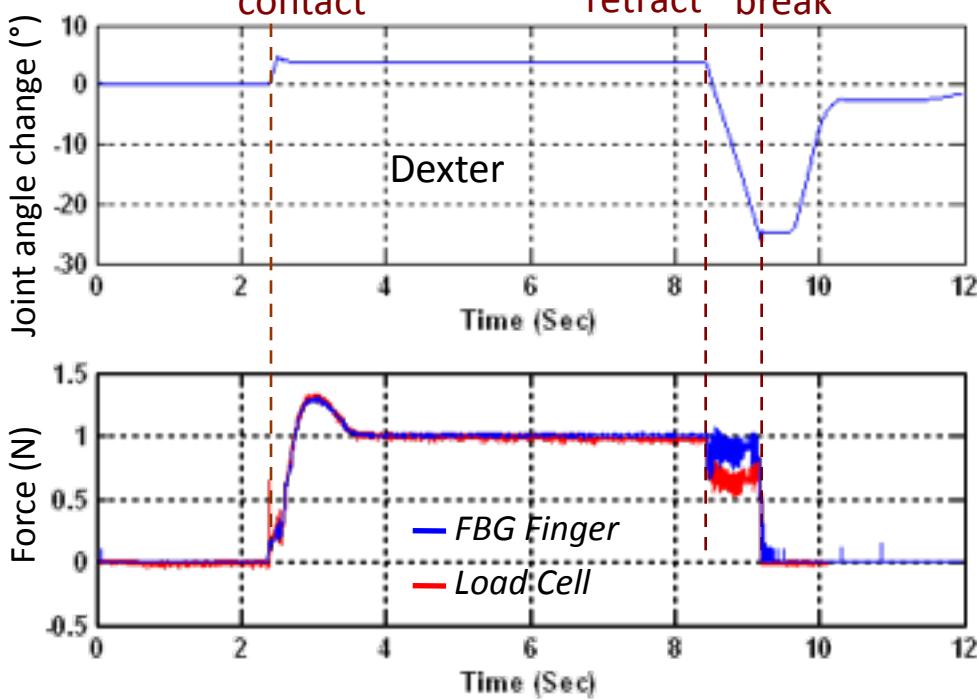
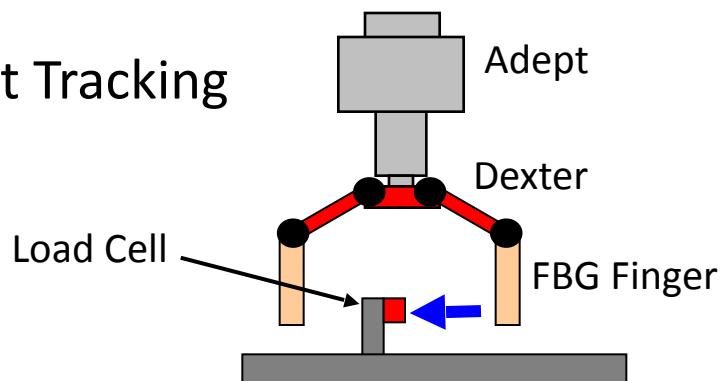
- FEM Simulation:
  - Offset:  $1.5^\circ$
  - Error:  $2^\circ$  ( $< 0.5$  mm on the perimeter)
- Experiment:
  - Offset:  $5^\circ$
  - Error:  $2^\circ$

# Longitudinal Location

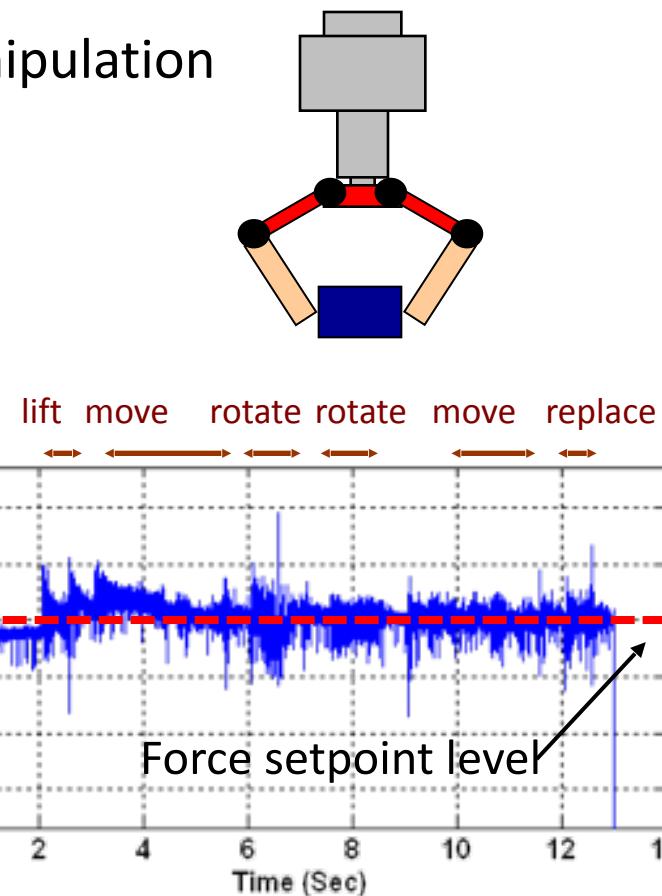


# Force Control Experiments

- Setpoint Tracking



- Manipulation

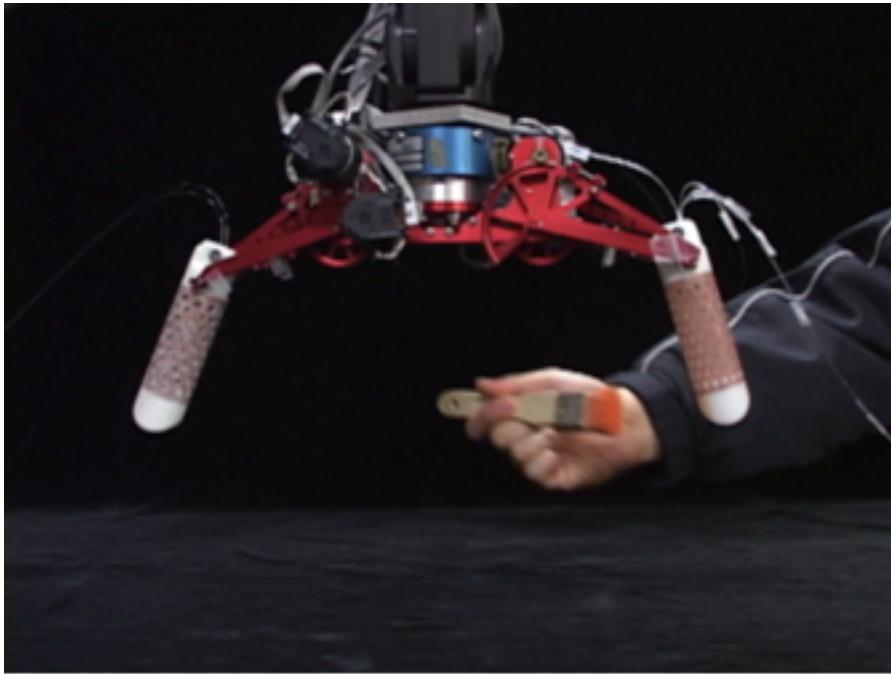


- RMS of force error: < 0.03 N
- Force recovery: < 0.01 sec

# Working Prototype

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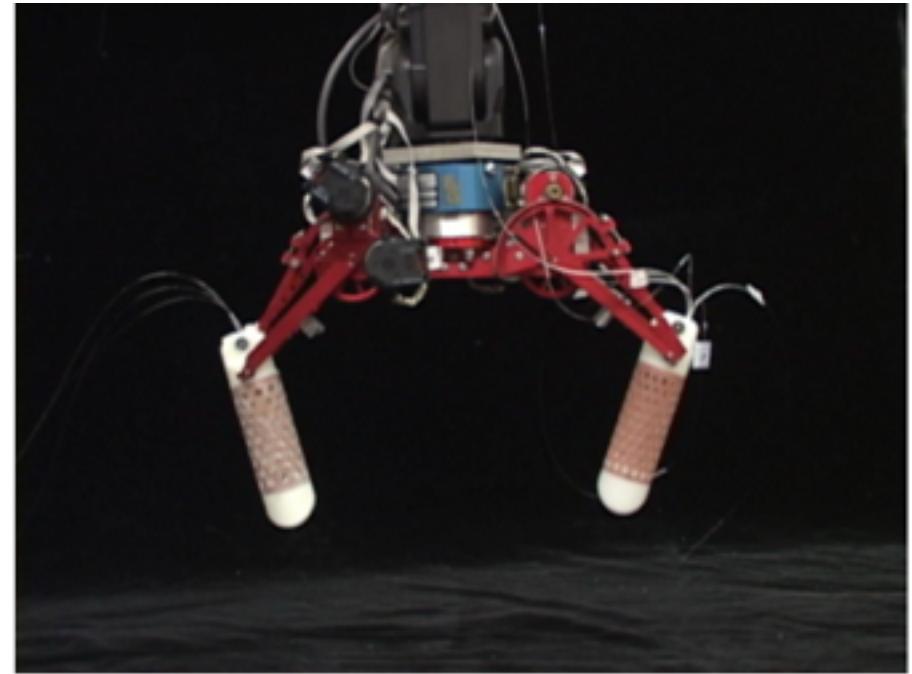
Smart force/position control



**Video Link:**

<http://www.youtube.com/watch?v=gO-6H1bi9PA>

Avoidance of unexpected contacts



**Video Link:**

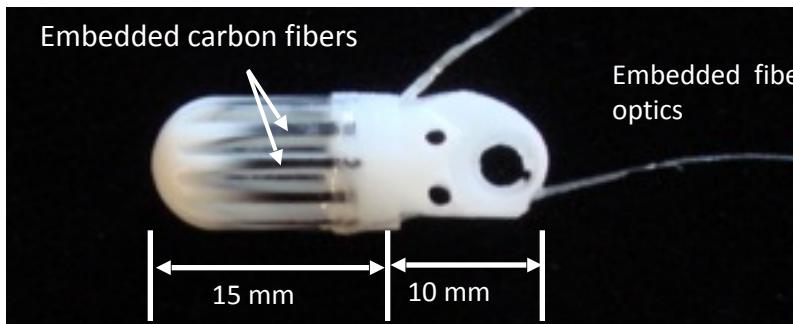
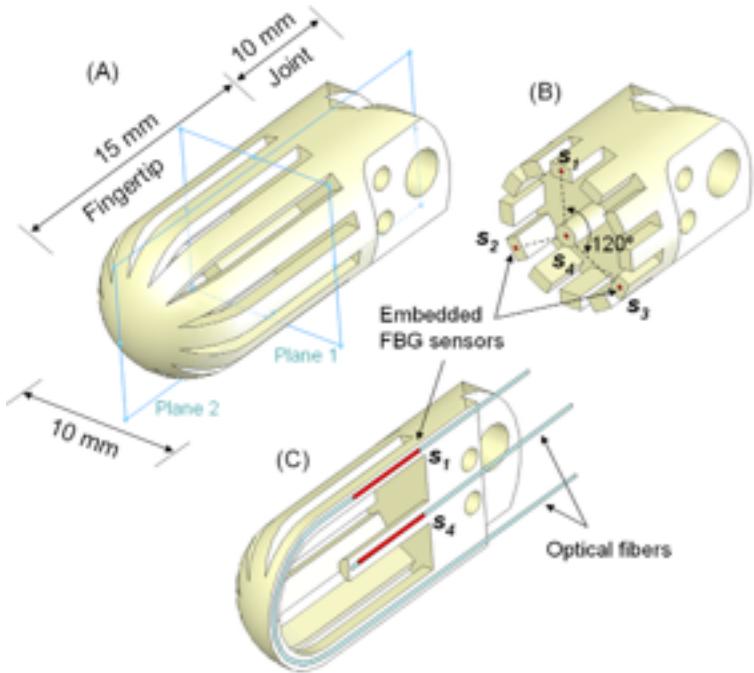
<http://www.youtube.com/watch?v=tyjpP3wYKmE>

Y-L Park, SC Ryu, MR Cutkosky et al., *IEEE Transactions on Robotics (T-RO)*, Vol. 25, No. 6, pp. 1319-1331, 2009.

Y-L Park, SC Ryu, MR Cutkosky et al., *Proc. IEEE ICRA'08*, pp. 3431-3136, 2008.

Y-L Park, K Chau, MR Cutkosky et al., *Proc. IEEE ICRA'07*, pp. 1510-1516, 2007 – Best Manipulation Paper Award finalist.

# Miniaturization



NASA Tech Brief Award (2012)

September 2012      www.techbriefs.com      Vol. 36 No. 9

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**Multiplexed Force and Deflection Sensing Shell Membranes for Robotic Manipulators**

This technology can be used to enhance precision in robotic surgery.

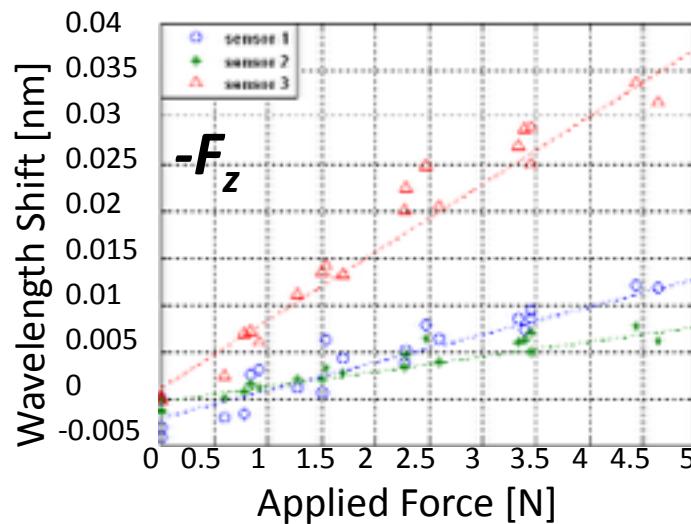
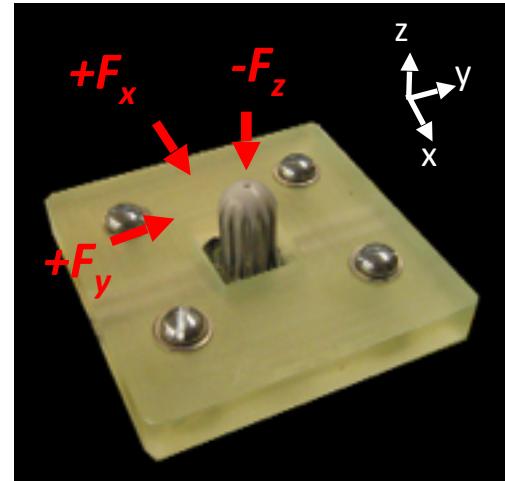
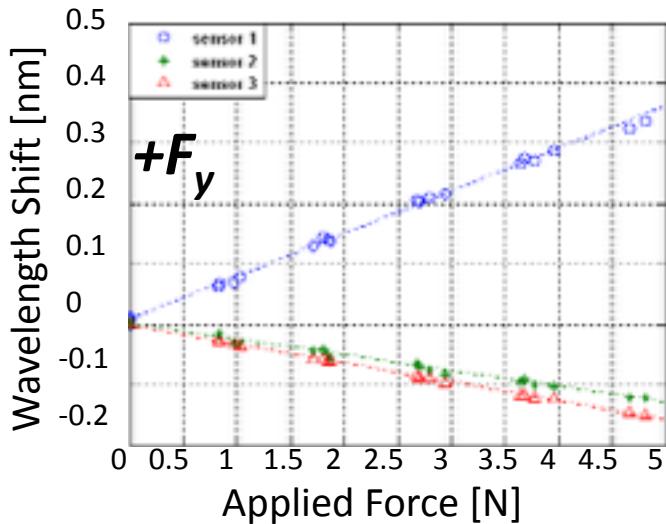
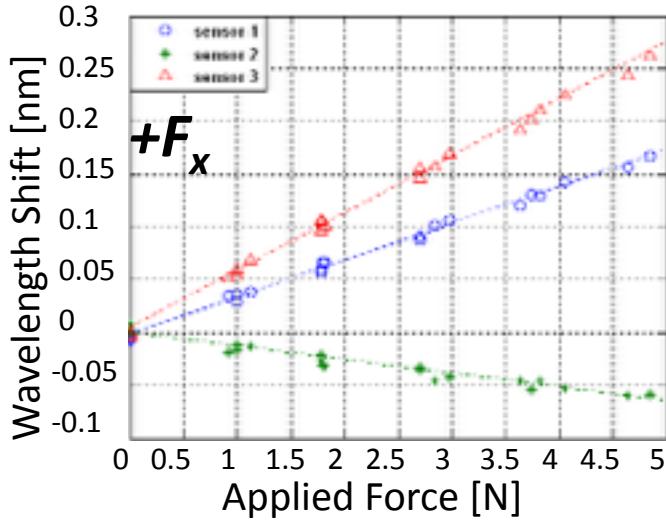
Lyndon B. Johnson Space Center, Houston, Texas

Y-L Park, MR Cutkosky et al., **US Patent 7,903,907** (2011).

Y-L Park, MR Cutkosky et al., **US Patent 8,257,991** (2012).

**Video Link:** <http://www.youtube.com/watch?v=QflufC-j7xI>

# Force Calibration



# Summary

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- Force Sensing Robot Fingers
- Objective:
  - Make light and strong robot structures that sense forces.
- Solution:
  - Biologically inspired, multi-material hollow structures with embedded fiber optic sensors and modified SDM.
- Results:
  - Force control RMS error: < 0.03 N
  - Force recovery time: 0.01 sec.
- Publications:
  - **YL Park**, SC Ryu, MR Cutkosky et al., “Design, Fabrication, and Control of Force Sensing Smart Robot Structures with Embedded Optical Fiber Grating Sensors,” *IEEE Transactions on Robotics*, Vol. 25, No. 6, 2009.
  - **YL Park**, SC Ryu, MR Cutkosky et al., “Fingertip Force Control with Embedded Fiber Bragg Grating Sensors,” *ICRA 2008*.
  - **YL Park**, K Chau, RJ Black, and MR Cutkosky, “Force Sensing Robot Fingers using Embedded Fiber Grating Sensors and Shape Deposition Manufacturing,” *ICRA 2007 – Finalist for Best Manipulation Paper Award*.

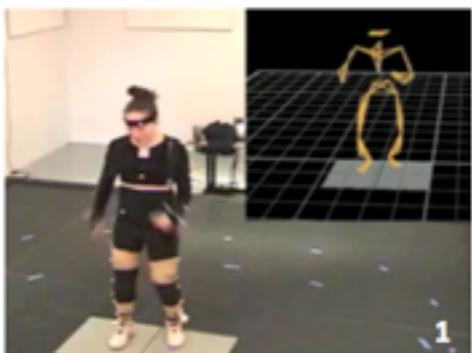
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- MRI-Compatible Shape Sensing Interventional Tools
  - MRI-Compatible Robotic End-Effector
  - **Soft Sensors**
  - Soft Actuators

# Background: Soft Sensing

## Body Motion Sensing

- Soft sensors for detecting 3-D body motions in real-time
- Requirements
  - Low-cost and low-power
  - Easily wearable
  - Conformable to body shape
- 3D Motion Capture Systems

Optical System (*Vicon*)



Inertial System (*Xsens*)



1. <http://www.youtube.com/watch?v=lihzWT6QRiU>

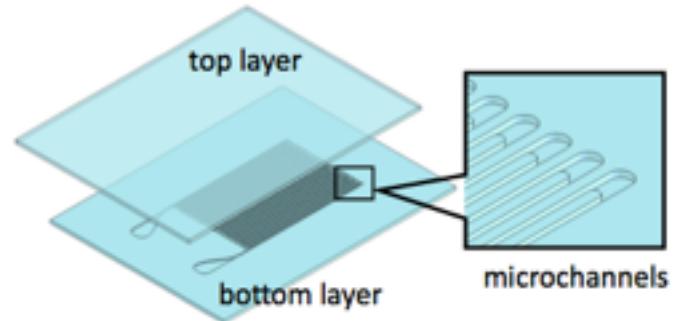
2. <http://www.youtube.com/watch?v=rKPrYftacFg>

- Eutectic Gallium-Indium (EGaIn)
  - Liquid metal at room temperature



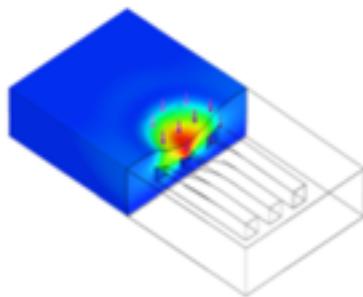
Chiechi et al., *Angew. Chem. Int. Ed.* 2008, 47, 142.

- Elastomer with embedded microchannels

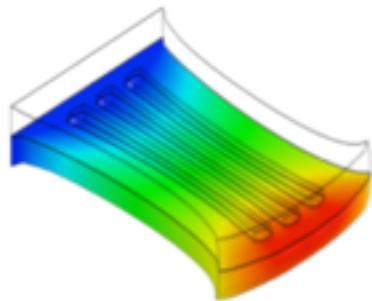
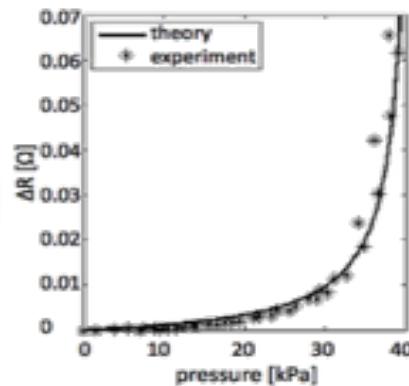


# Soft Artificial Skin Sensors

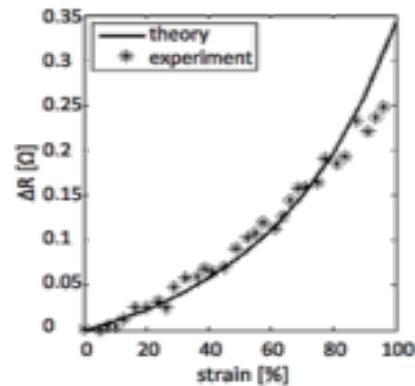
Hyperelastic material with embedded microchannels and conductive liquid



Pressure sensing



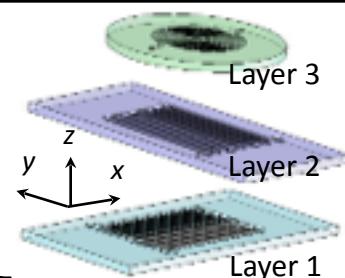
Strain sensing



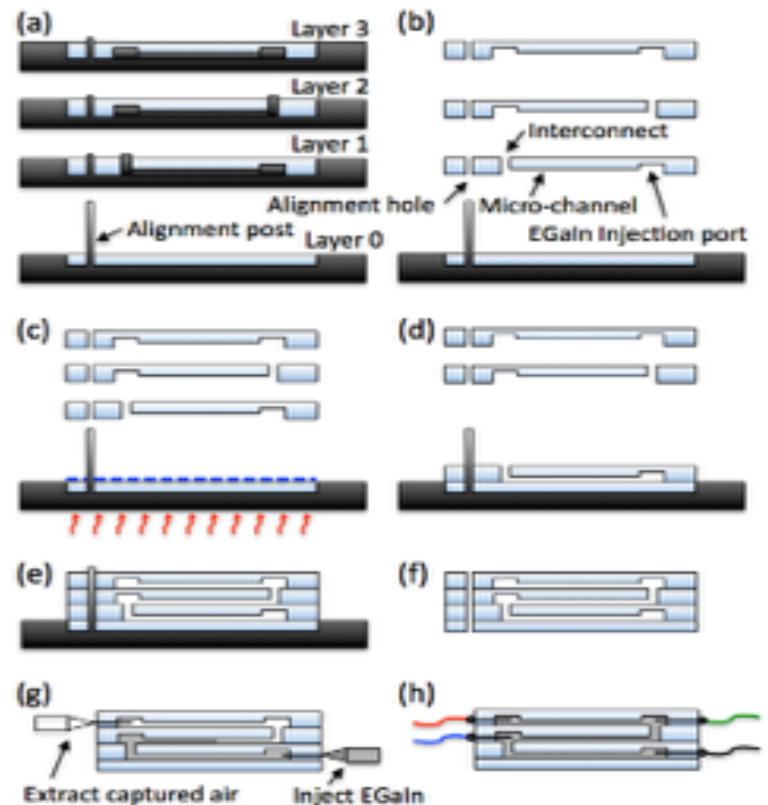
YL Park, C Majidi, RJ Wood et al., *Journal of Micromechanics and Microengineering*, Vol. 20, No. 12, 2010.

C Majidi, Y-L Park et al., US Patent 8,316,719, 2012.

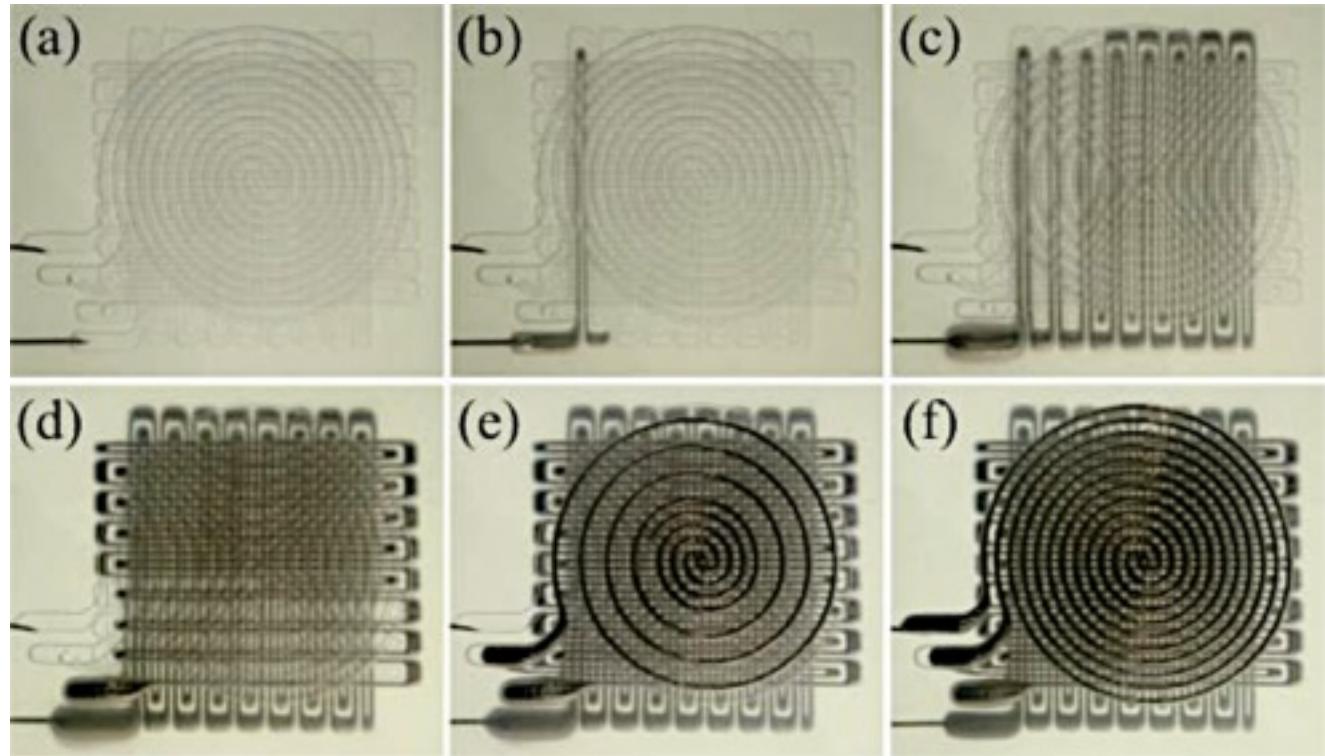
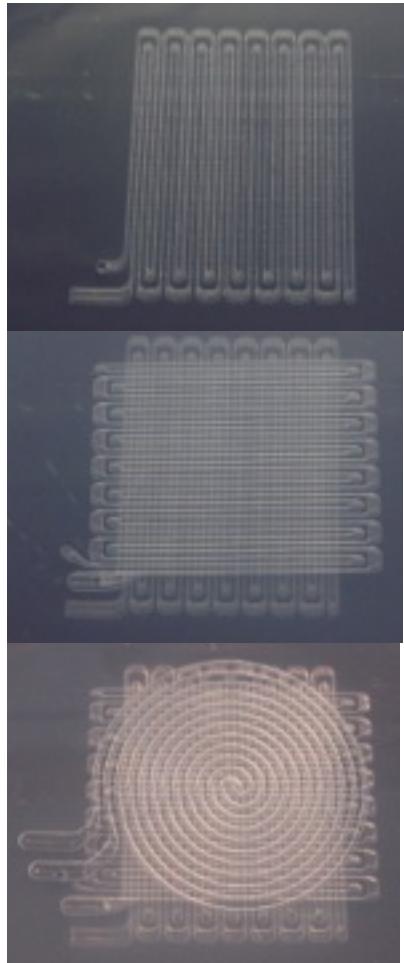
Multi-layered structure  
for multi-modal sensing



Manufacturing:  
Layered molding/casting



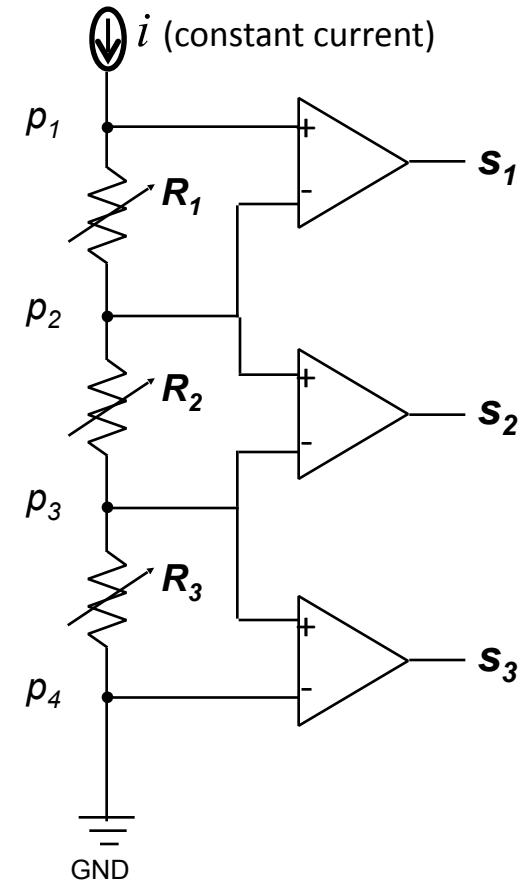
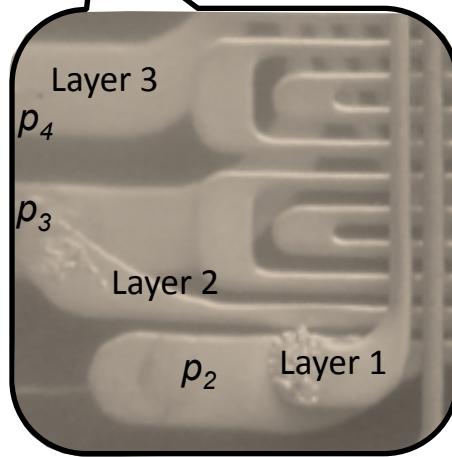
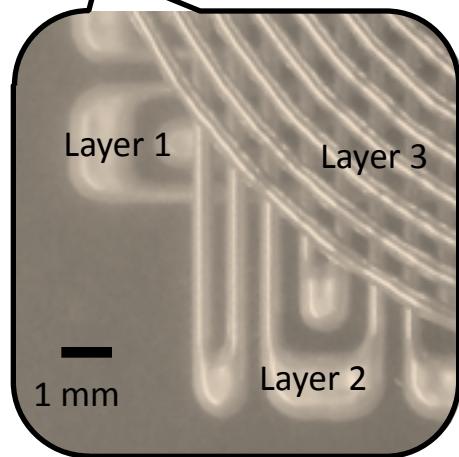
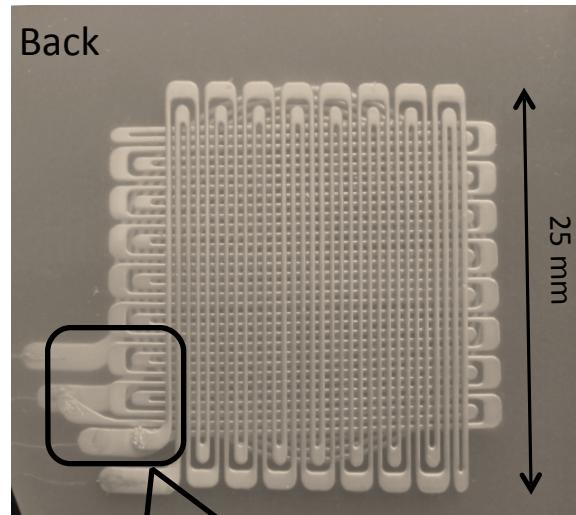
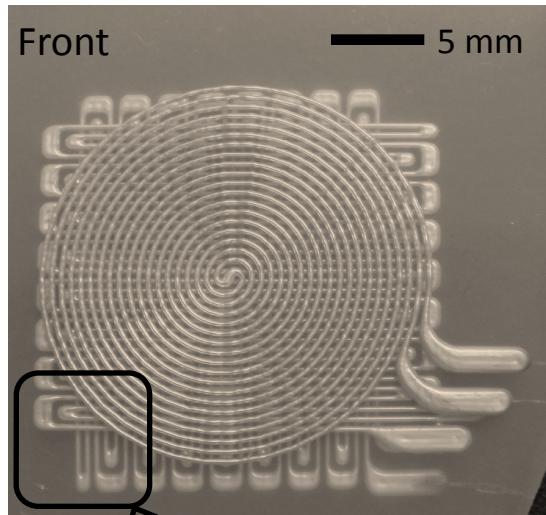
# EGaIn Injection Process



Sensor thickness: Approx. 3.5 mm  
Channel size: 200  $\mu\text{m}$  x 200  $\mu\text{m}$   
Entire channel length: Approx. 2 m  
Filling time: 1 min

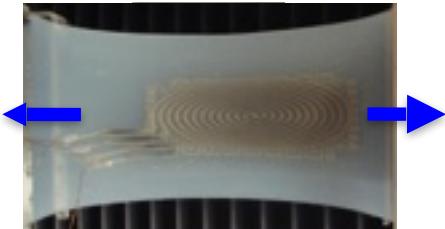
**Video Link:** <http://www.youtube.com/watch?v=-H4sbyA4gE>

# Complete Prototype



# Sensor Calibration

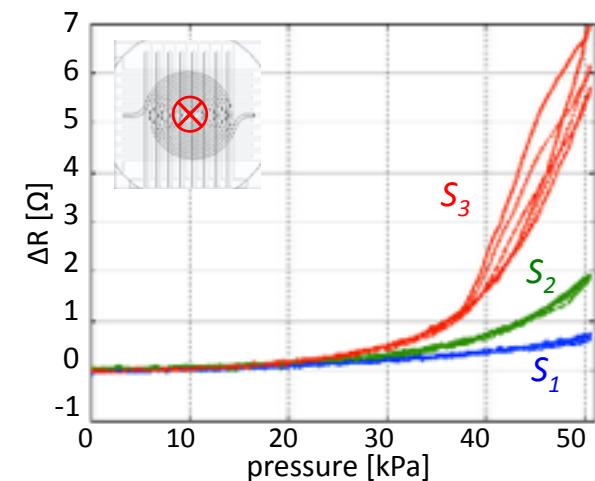
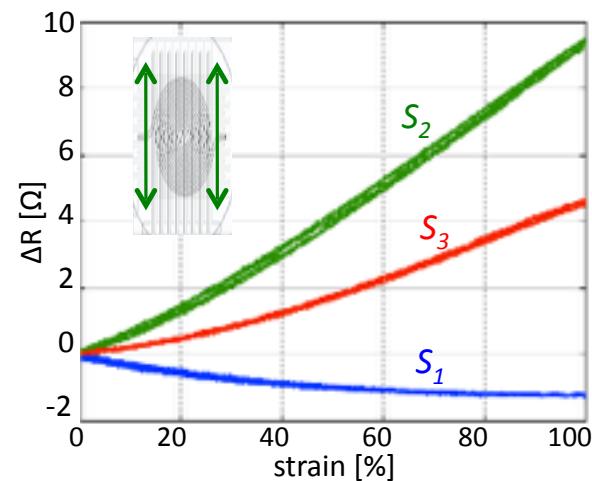
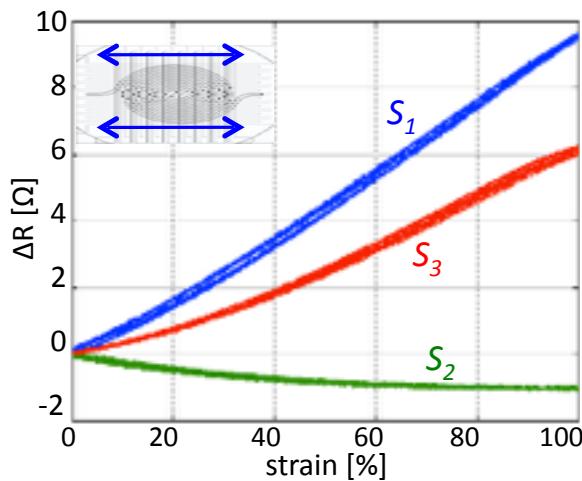
x-axis strain



y-axis strain



z-axis pressure

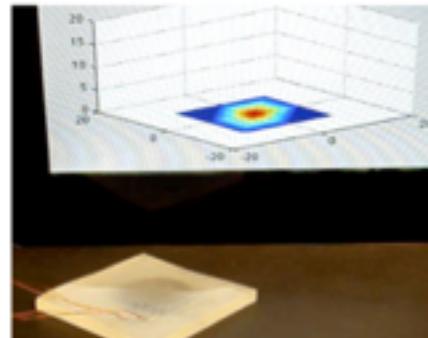


# Soft Artificial Skin

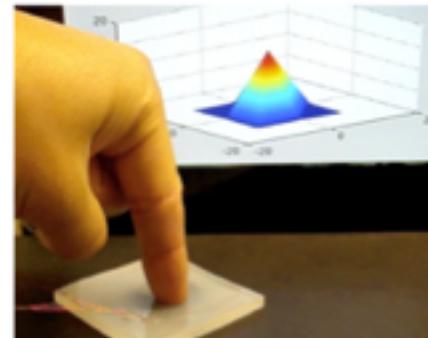


A Pressure and Strain Sensor  
fabricated on Soft Artificial Skin

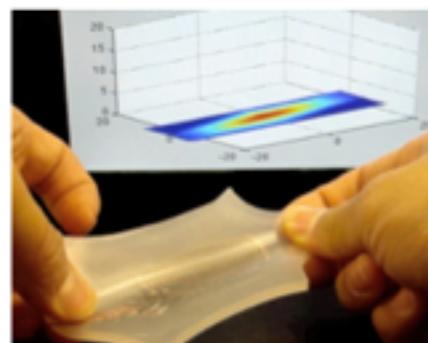
By Y.-L. Park, B. Chen, and R. J. Wood



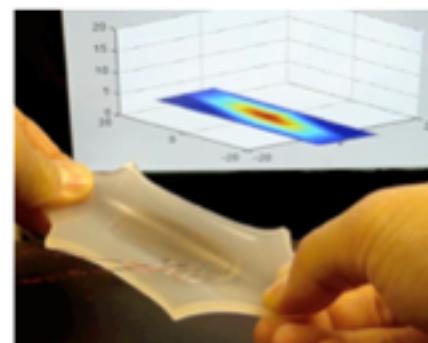
No stimulus



z-axis pressure sensing



x-axis strain sensing



y-axis strain sensing

**Video Link:** <http://www.youtube.com/watch?v=6CLTv-CyMH4>

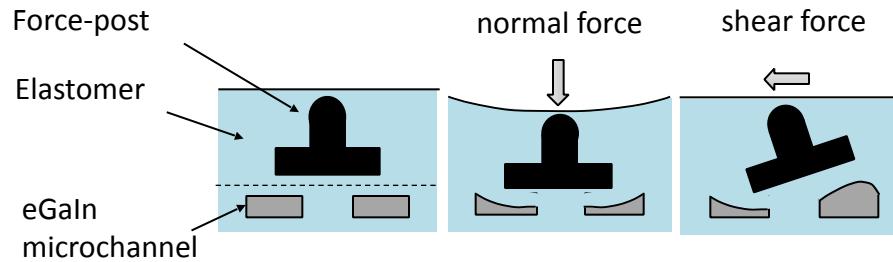
YL Park, B Chen, and RJ Wood, *IEEE Sensors Journal*, Vol. 12, No. 8, pp. 2711-2718, 2012.

**Cover Article, Best Paper of 2012**

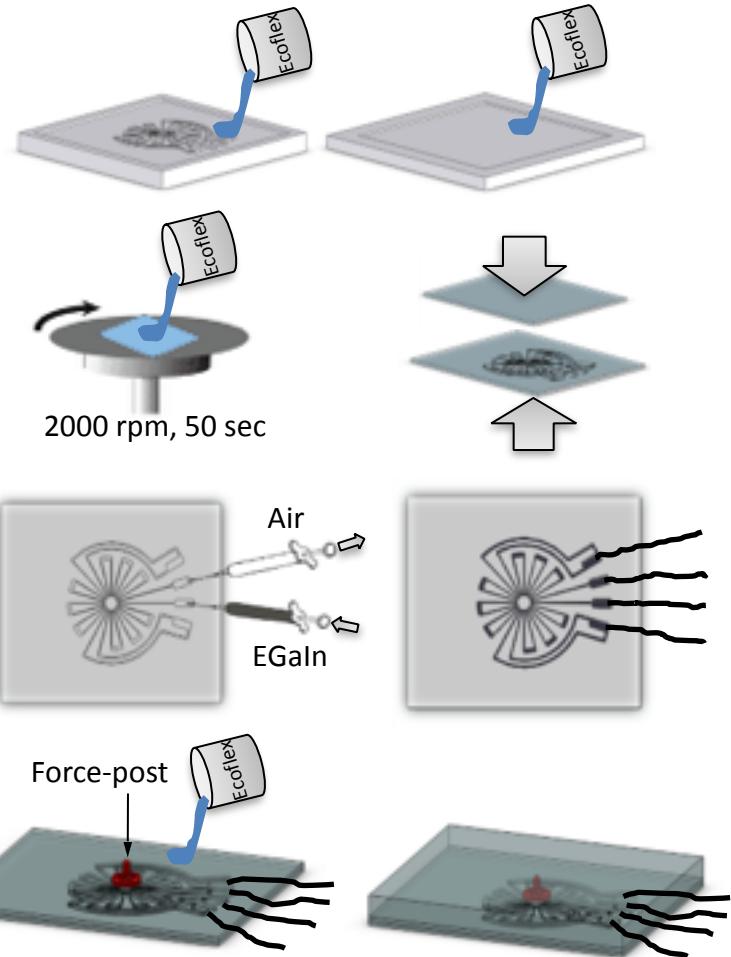
YL Park, D Tepayotl-Ramirez, RJ Wood, and C Majidi, *Applied Physics Letters*, Vol. 101, No. 19, 2012.

# Soft Multi-Axis Force Sensor

## Design Concept:



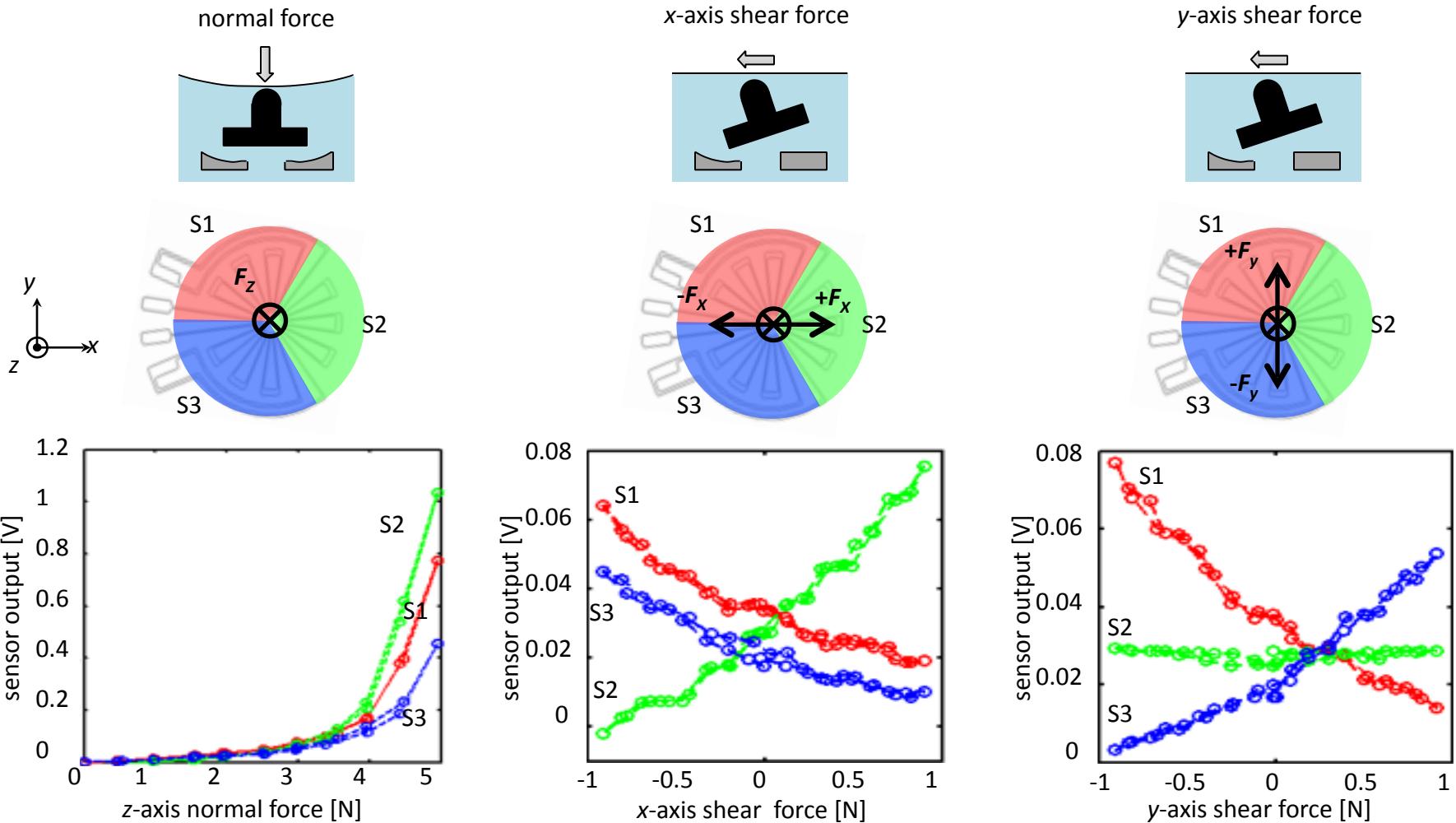
## Manufacturing:



D Vogt, YL Park (co 1-st author), and RJ Wood, *IEEE Sensors Journal*, Vol. 20, No. 12, pp. 4056-4064, 2013.

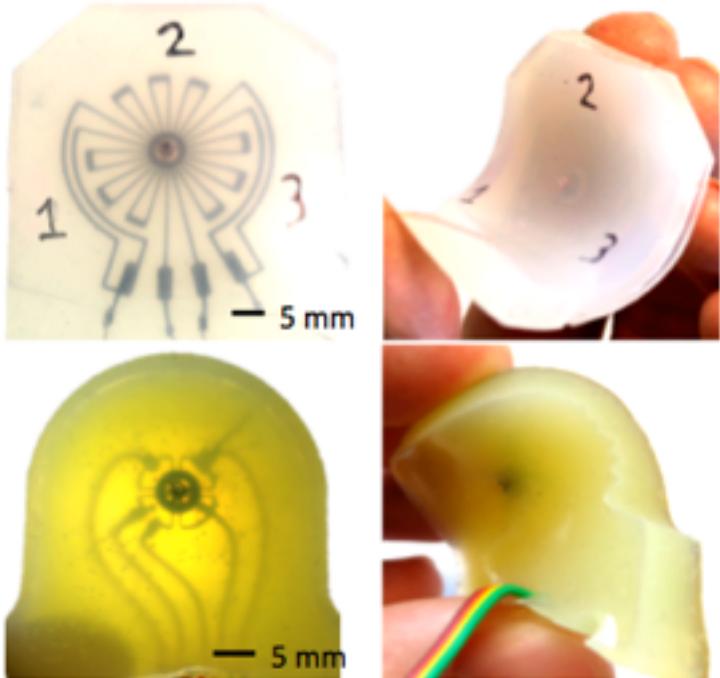
D Vogt, YL Park, and RJ Wood, *Proc. IEEE Sensors Conf.*, Vol. 13, No. 10, pp. 897-900, 2012.

# Sensor Calibration

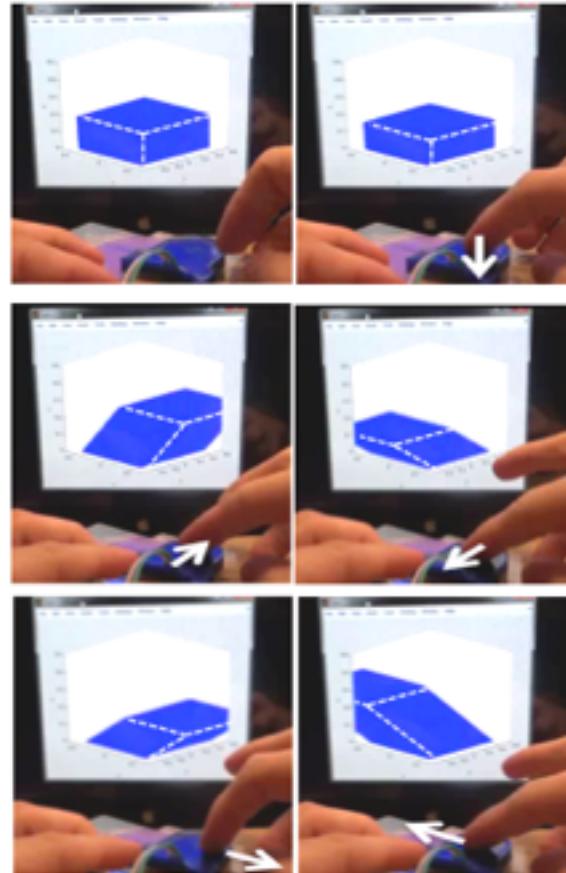


# Soft 3-Axis Force Sensor

Complete prototypes



Prototype in action



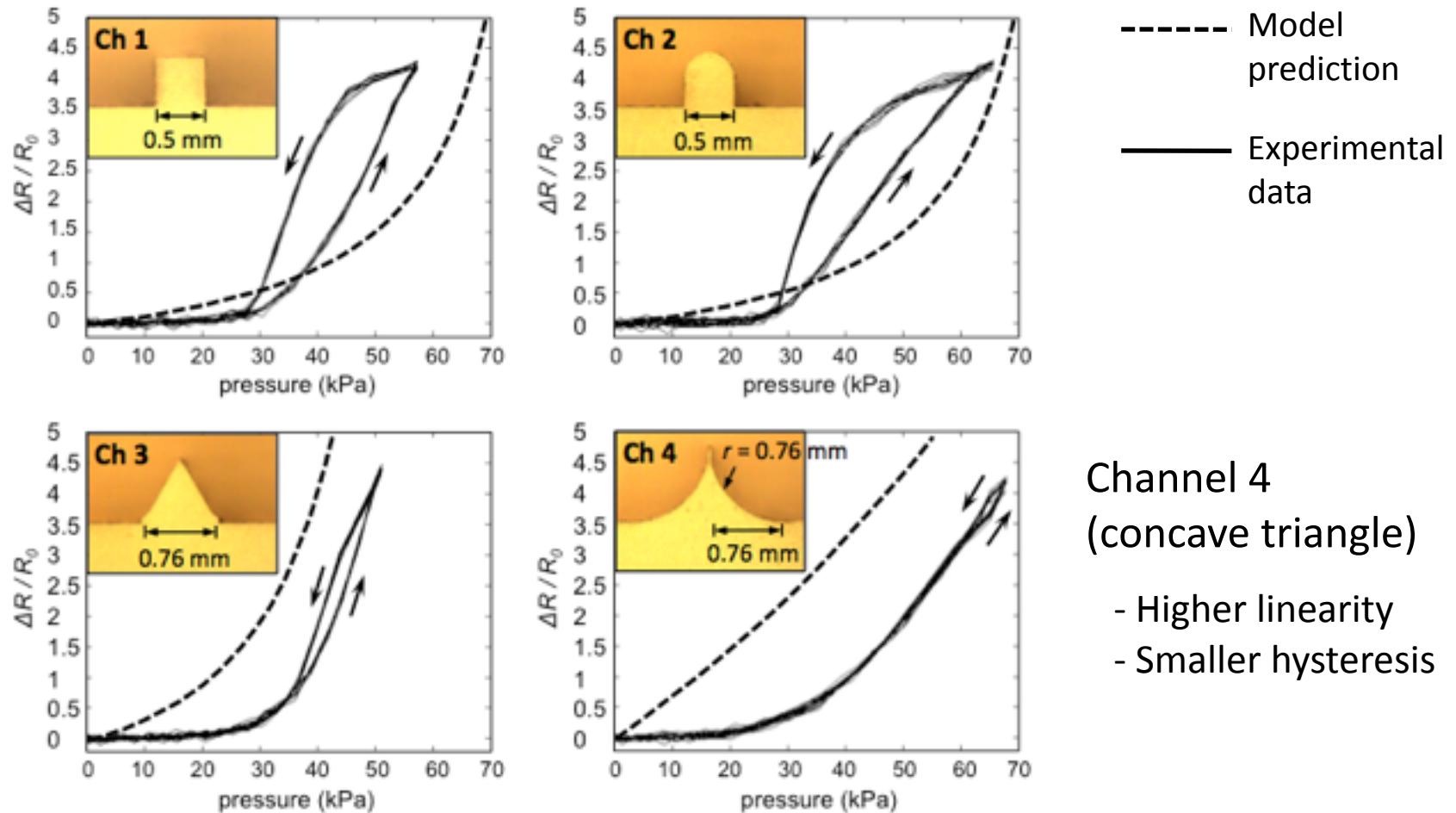
Normal force  
sensing (*z-axis*)

Shear force  
sensing (*x-axis*)

Shear force  
sensing (*y-axis*)

**Video Link:** <http://www.youtube.com/watch?v=BdckdYS5xqY>

# Improved Pressure Response



Channel 4  
(concave triangle)

- Higher linearity
- Smaller hysteresis

Y-L Park, D Tepayotl-Ramirez, C Majidi et al., *Applied Physics Letters*, Vol. 101, No. 19. 2012.  
D Tepayotl-Ramirez, T Lu, Y-L Park et al., *Applied Physics Letters*, Vol. 102, No. 4, 2013

# Summary: Soft Sensors

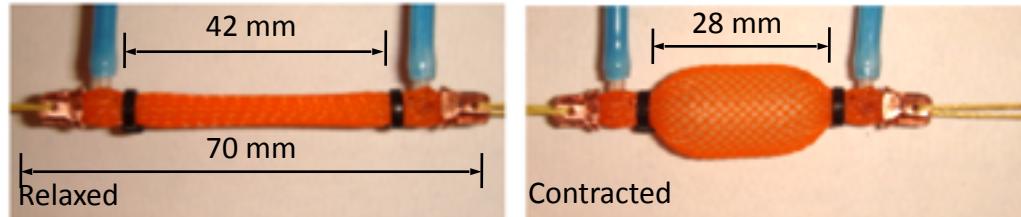
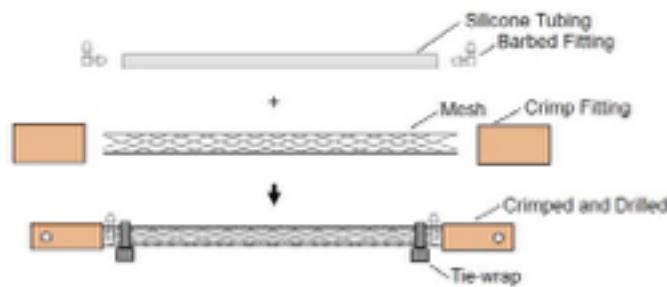
---

- Objective:
  - Highly flexible and stretchable skin sensors with multi-modalities
- Enabling technologies:
  - Multi-layered soft smart structures
  - Layered molding and casting process
- Results:
  - Stretchable pressure and strain sensor
  - Soft multi-axis force sensor etc.
- Publications:
  - **Y-L Park**, B Chen, RJ Wood et al., *IEEE Sensors Journal*, 2012 – **Cover Article**.
  - **Y-L Park**, D. Tepayotl-Ramirez, C Majidi et al., *Applied Physics Letters*, 2012.
  - **Y-L Park**, C Majidi, RJ Wood et al., *Journal of Micromechanics and Microengineering*, 2010.
  - D. Tepayotl-Ramirez, T Lu, **Y-L Park** et al., To appear in *Applied Physics Letters*, 2013.
  - **Y-L Park**, D Vogt, and RJ Wood, *IEEE Sensors Journal*, 2013 – in review
  - D Vogt, **Y-L Park**, and RJ Wood, Proc. *IEEE Sensors Conf.*, 2012.
  - **Y-L Park**, B Chen, and RJ Wood, Proc. *IEEE Sensors Conf.*, 2011.

- 
- MRI-Compatible Shape Sensing Interventional Tools
  - MRI-Compatible Robotic End-Effector
  - Soft Sensors
  - **Soft Actuators**

# Pneumatic Artificial Muscles (PAM)

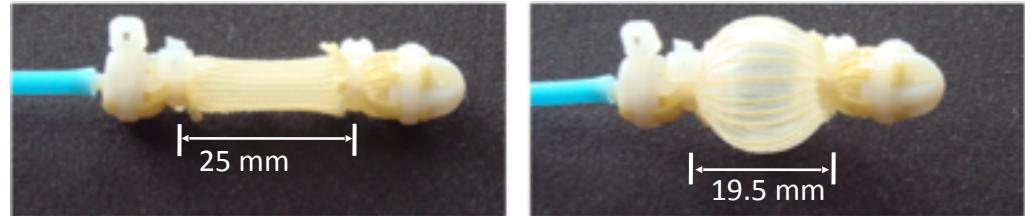
## Miniaturized McKibben muscle



Y-L Park, B Chen, C Majidi et al., *IEEE/RSJ IROS*, 2012.

**Video Link:** [http://www.youtube.com/watch?v=zGDjQ\\_4hSdI](http://www.youtube.com/watch?v=zGDjQ_4hSdI)

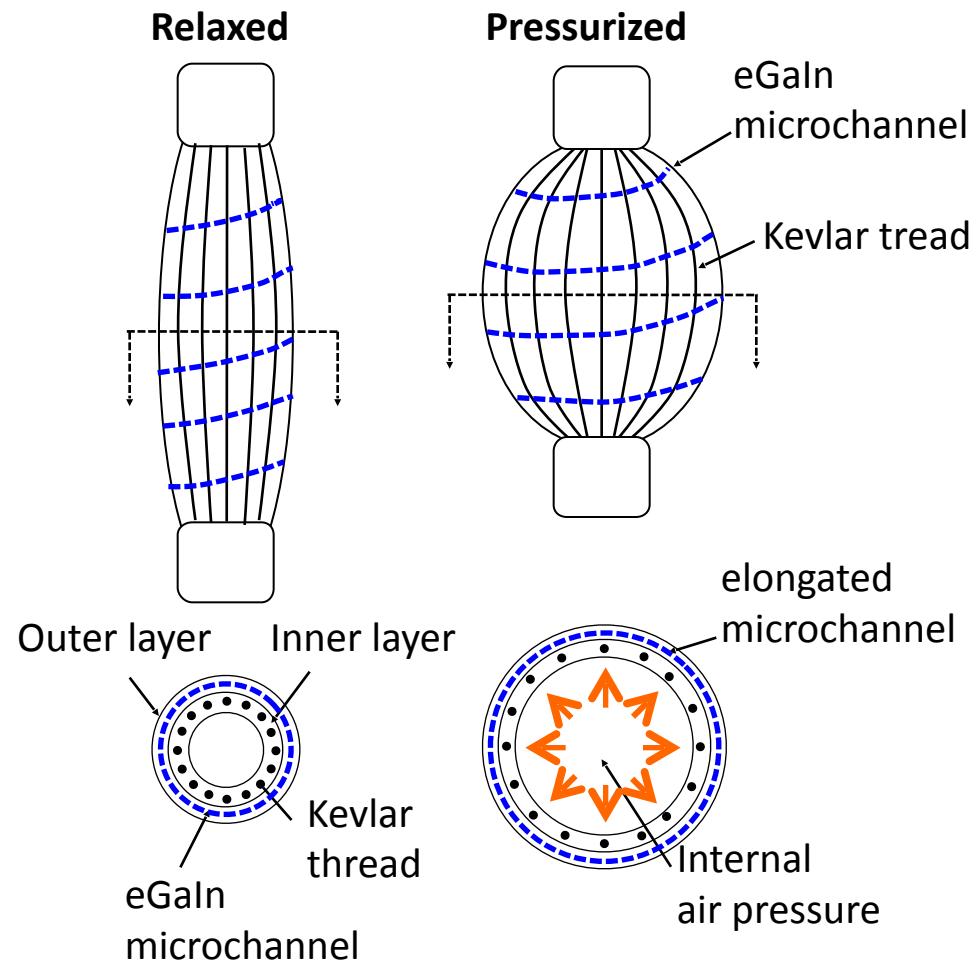
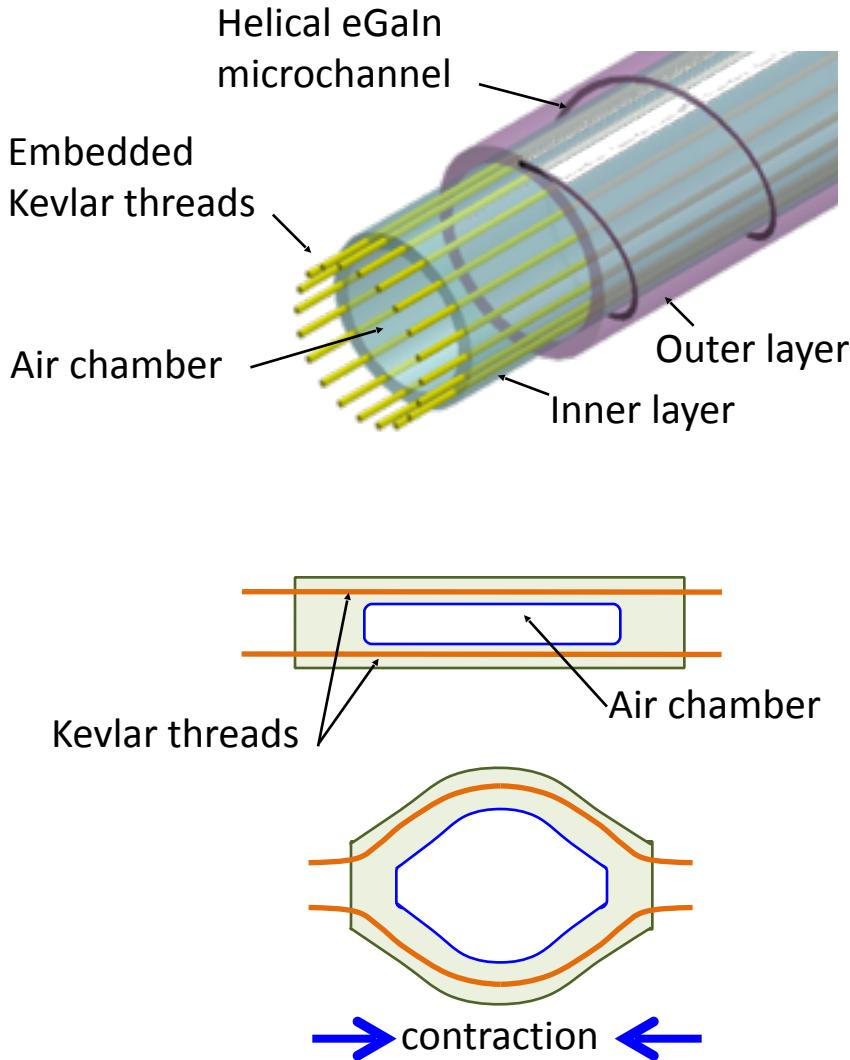
## Bio-Inspired Elastomer muscle



EC Goldfield, Y-L Park, RJ Wood et al., *Ecological Psychology*, 2012.

**Video Link:** <http://www.youtube.com/watch?v=tatgfRWtiT4>

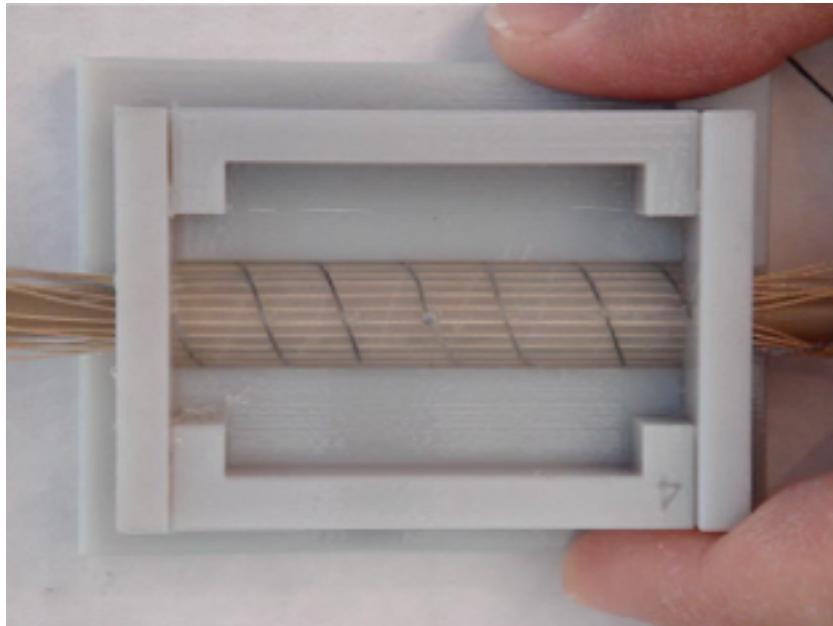
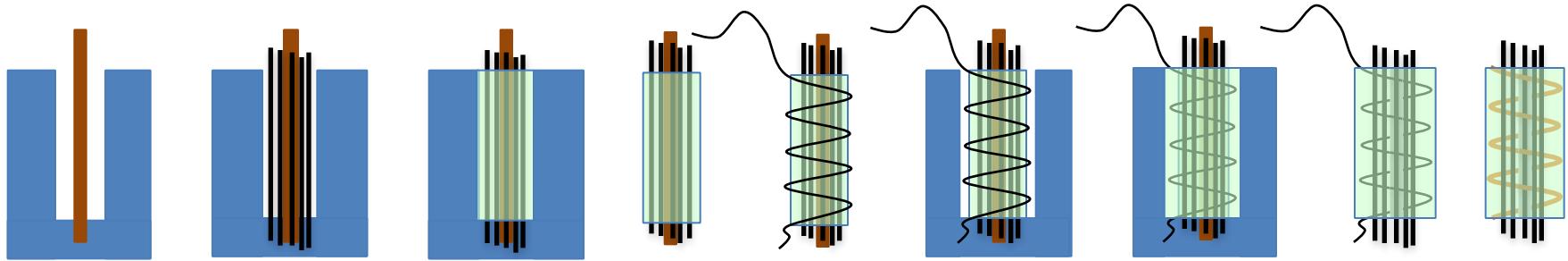
# Prototype Design



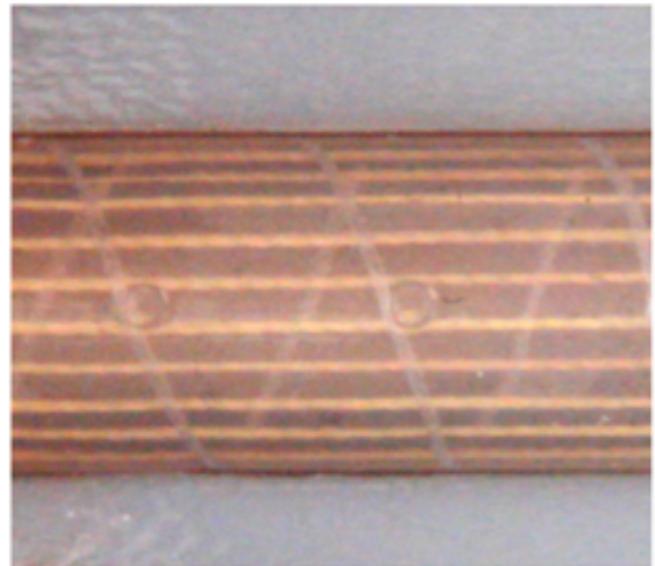
# 3-D Manufacturing

---

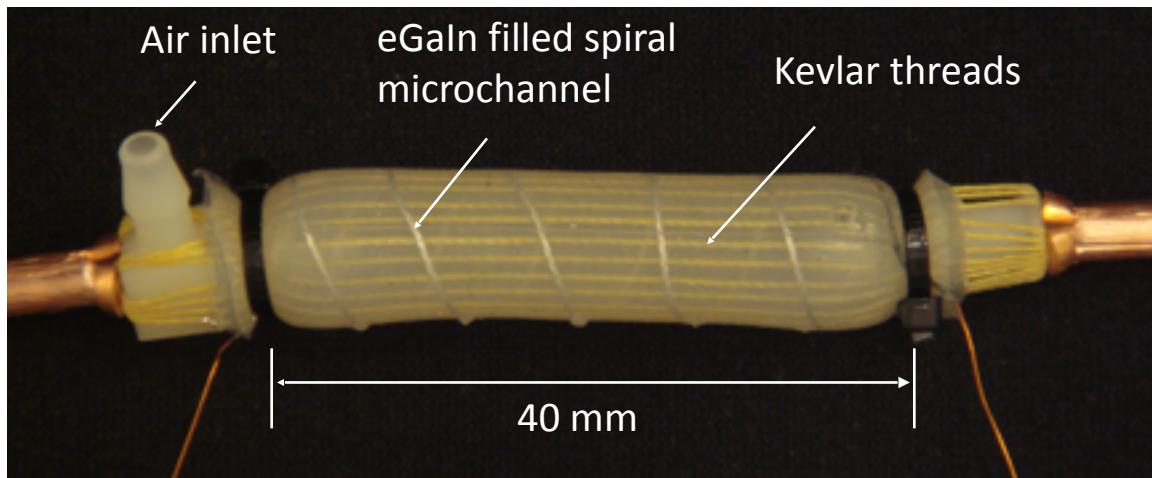
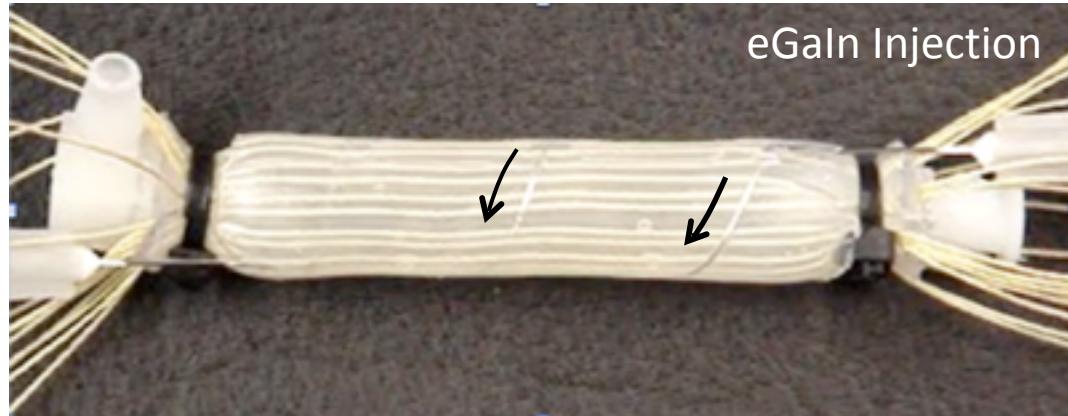
## Fabrication – Helical microchannel



=>

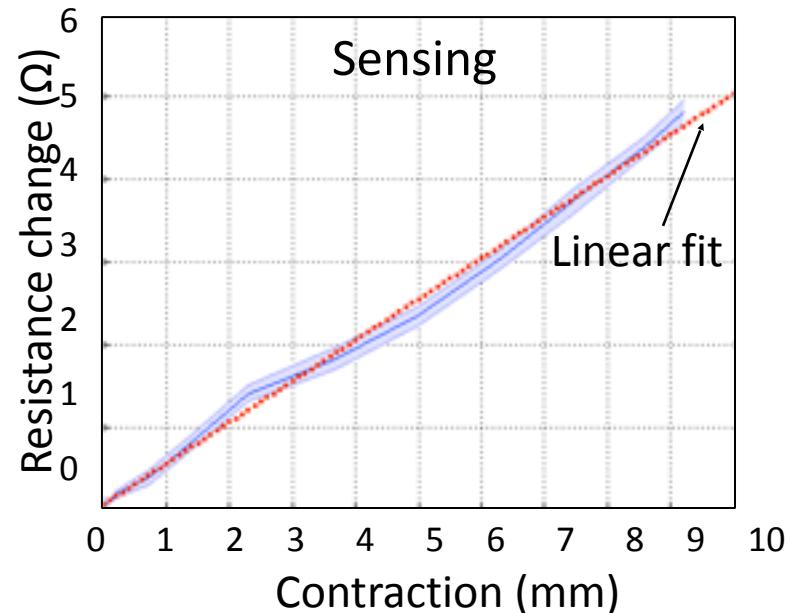
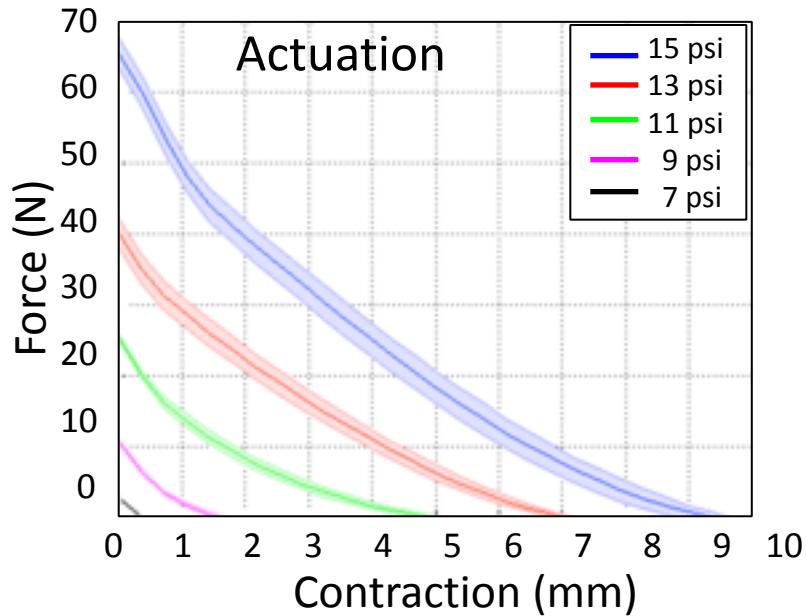
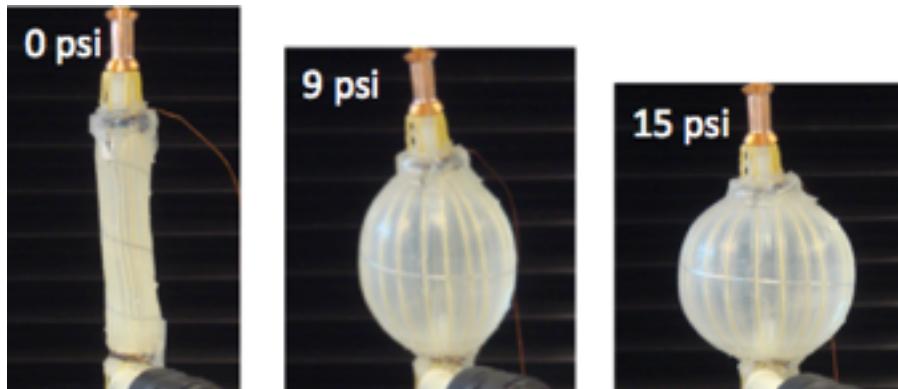


# Actual Prototype



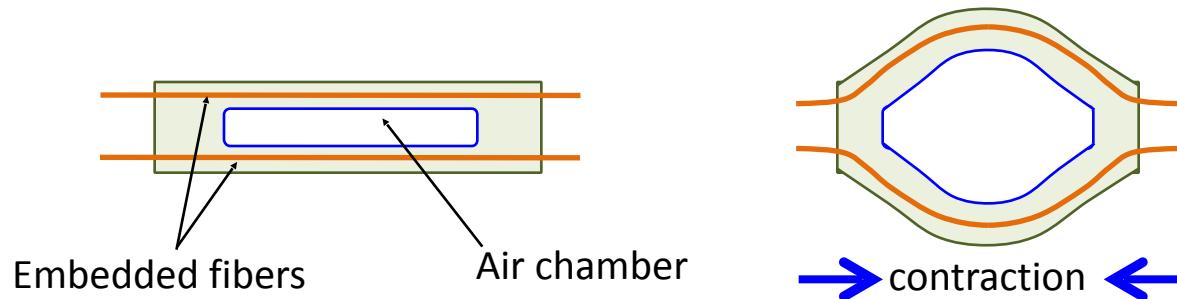
Y-L Park and RJ Wood, *IEEE Sensors Conf.*, 2013.

# Characterization

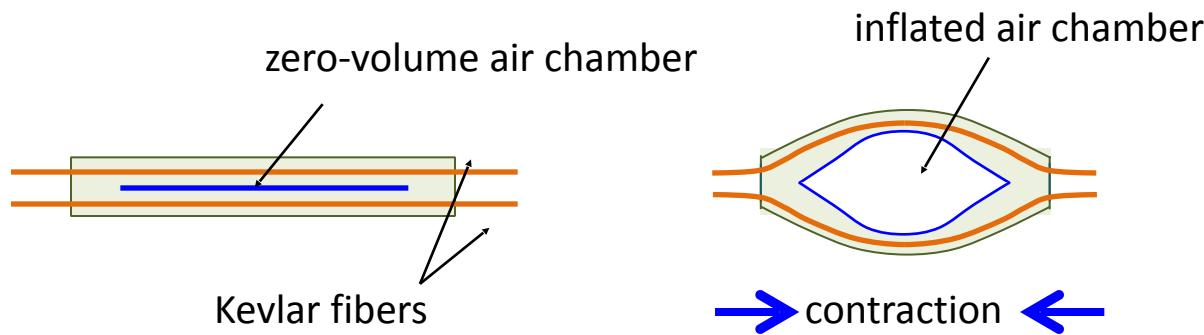


# Flat Pneumatic Artificial Muscle

## Conventional Design

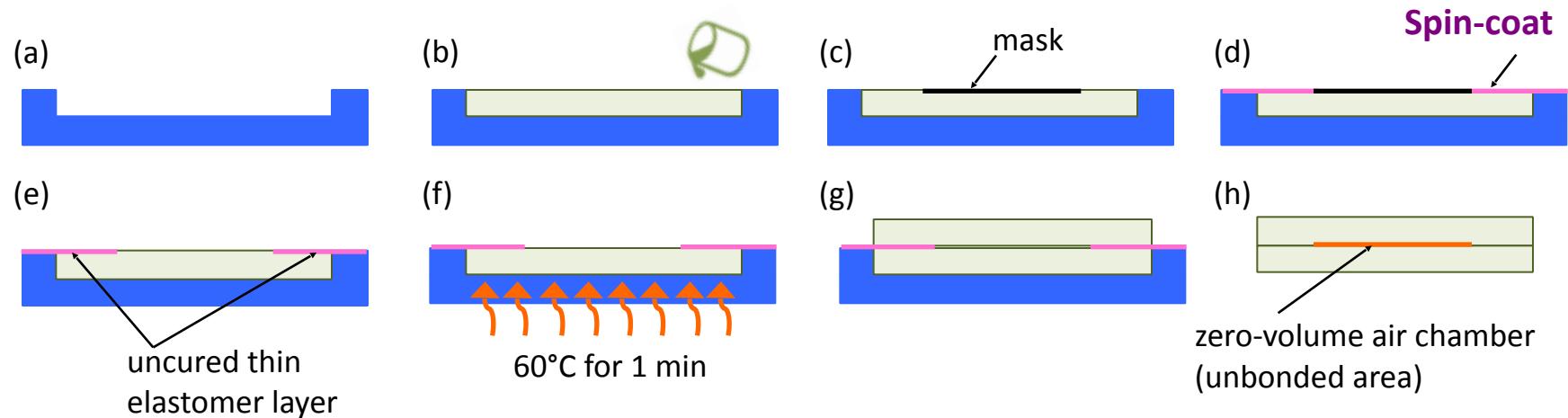
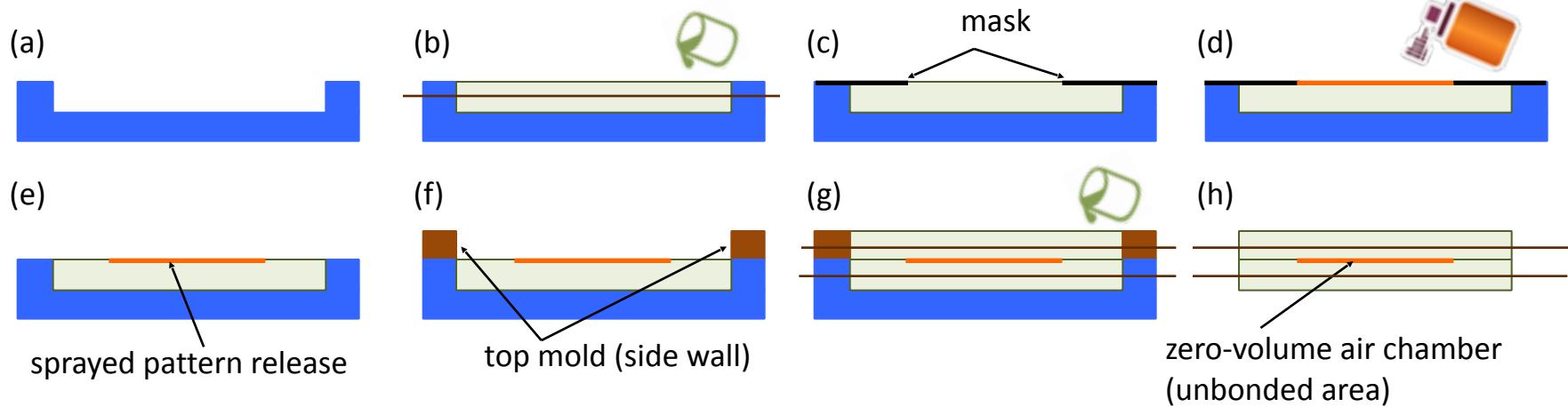


## New Design: Zero-volume chamber

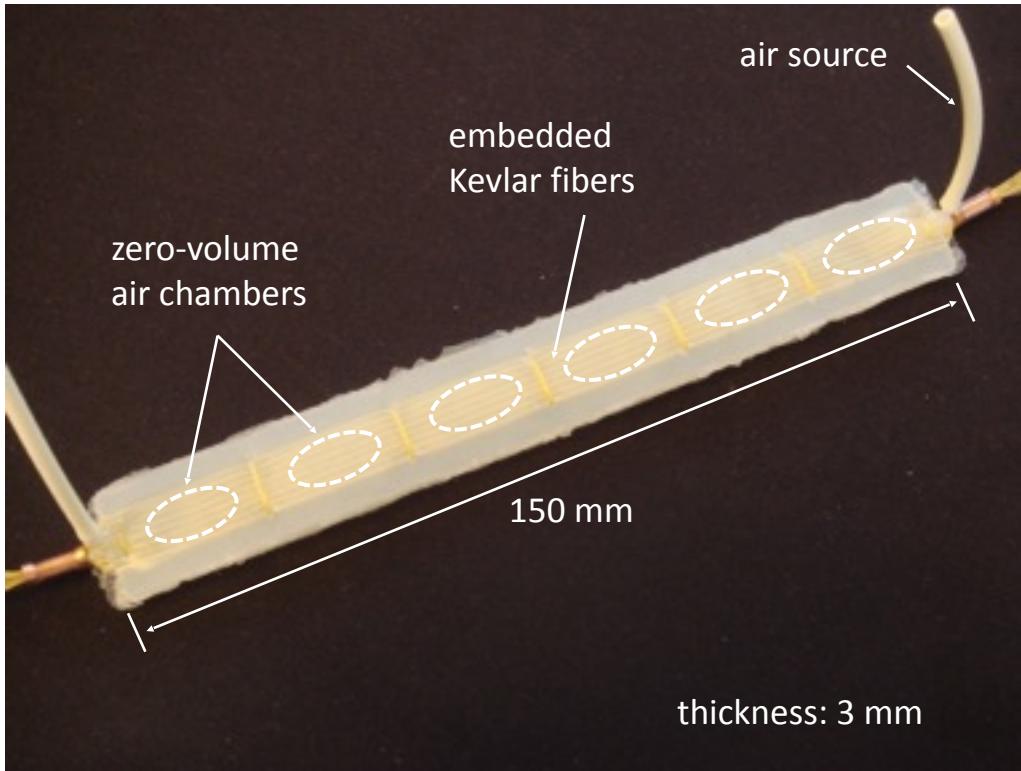


# Manufacturing Process

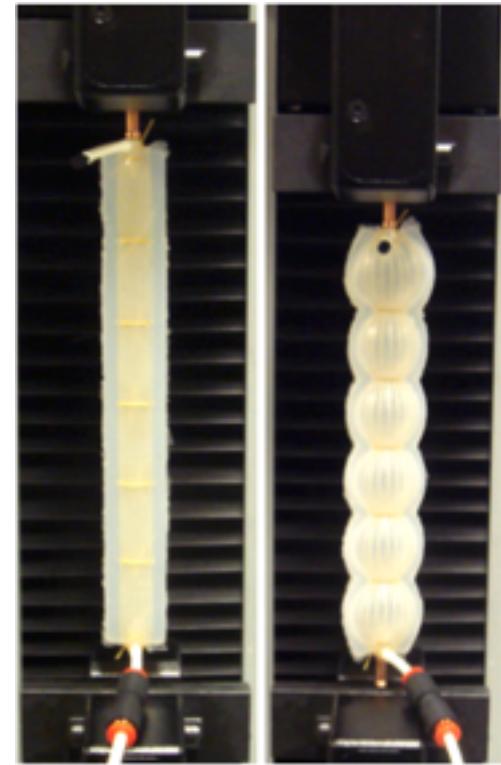
## Zero-volume air chamber



# Complete Prototype



Y-L Park, J Santos, RJ Wood et al., *IEEE ICRA'14*, 2014.



Air pressure: 15 psi  
Max. contraction: 25%

# Application – Active Soft Orthotics (1)

## Motivation: Drop-foot

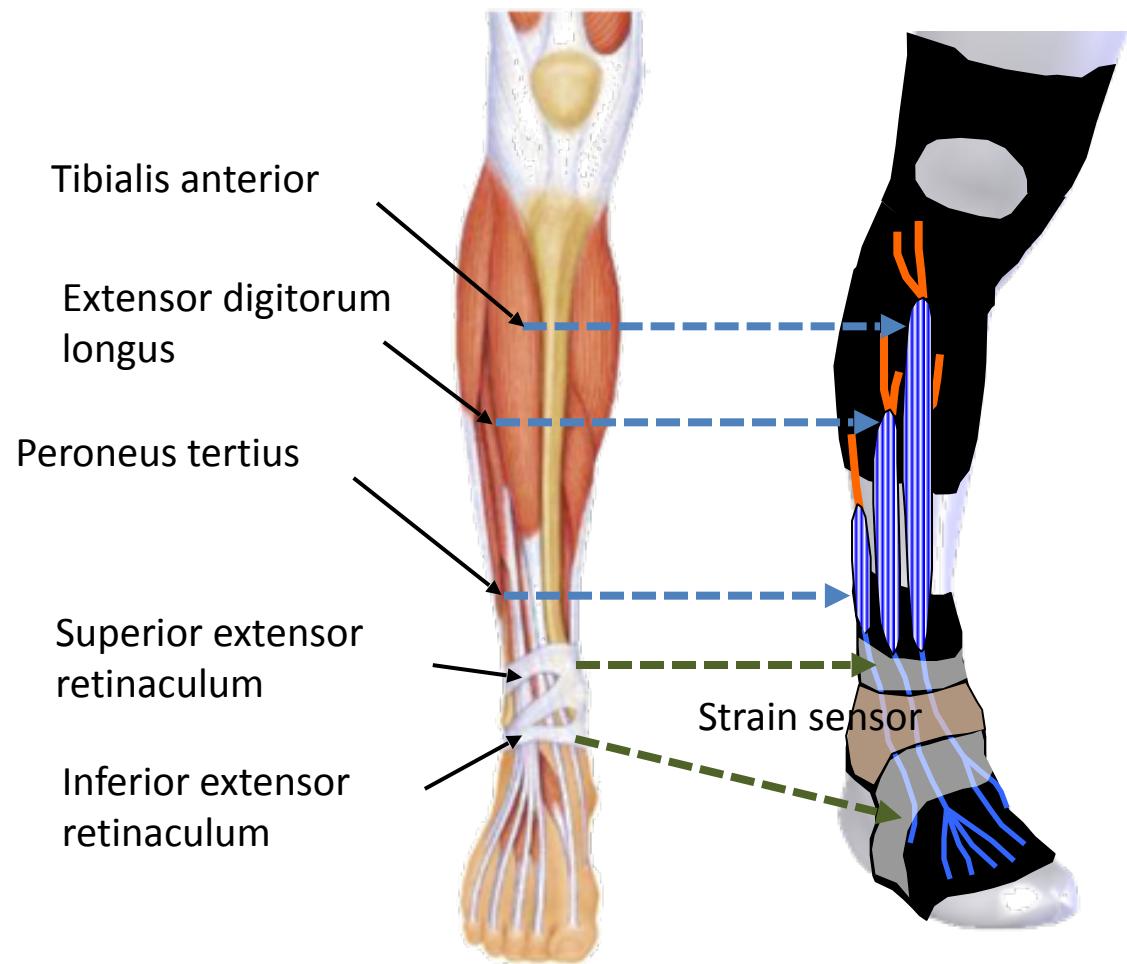


<<http://www.neurosurgical.com>>

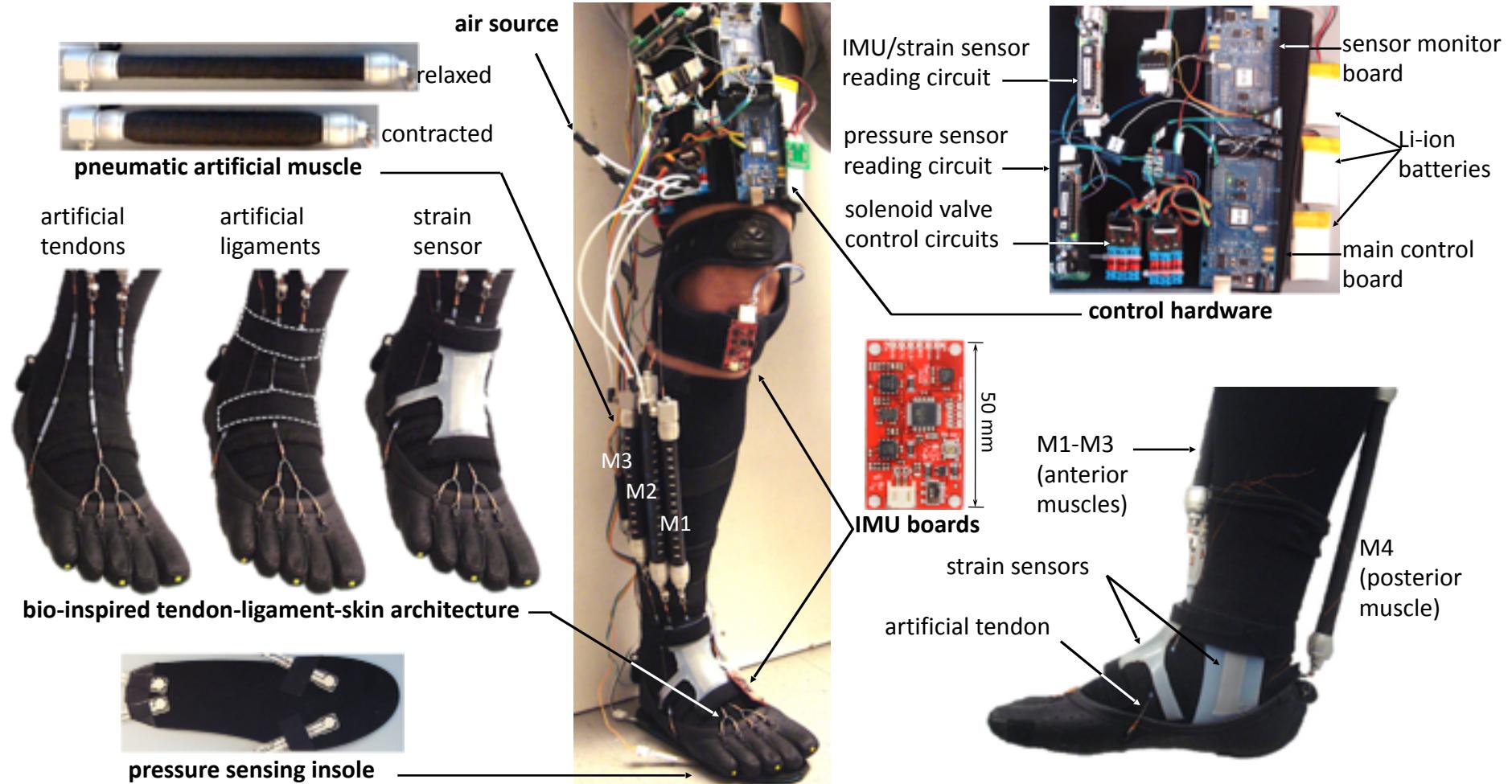


<<http://shopshacksite.com>>

## Bio-Inspired Design



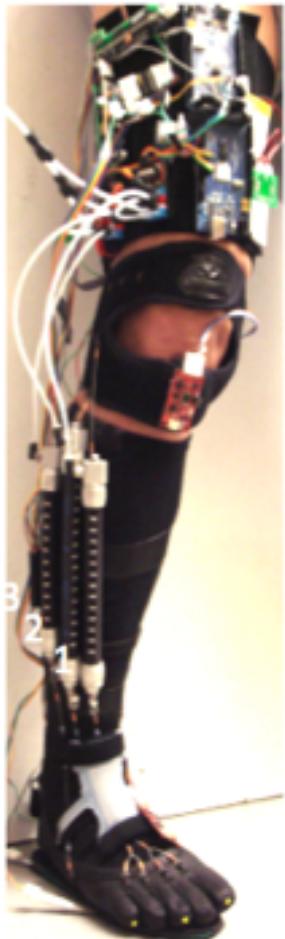
# Application – Active Soft Orthotics (2)



YL Park, B Chen, R Nagpal et al., *Biomimetics & Bioinspiration*, 2014.

YL Park, B Chen, R Nagpal et al., *IEEE IROS*, 2011.

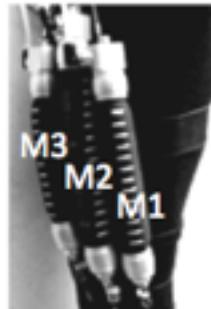
# Application – Active Soft Orthotics (3)



## *Active Sagittal Motions*



Dorsiflexion



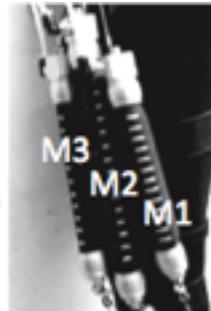
Plantarflexion



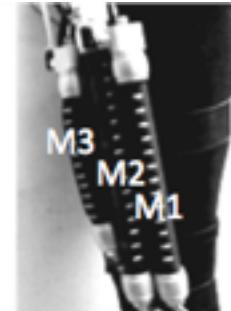
## *Active Mediolateral Motions*



Inversion

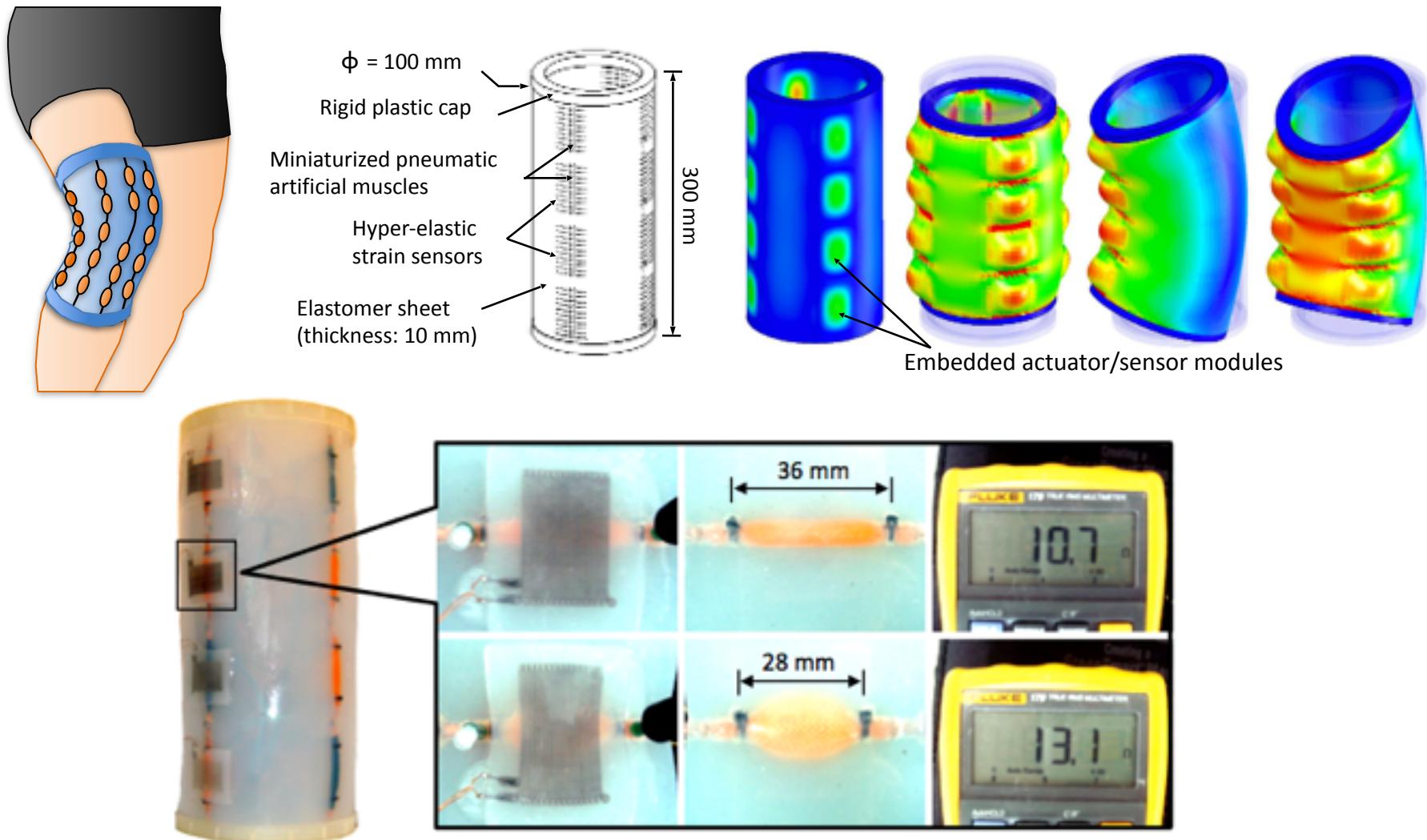


Eversion



*Video Link:* <http://www.youtube.com/watch?v=lbXRiTbuDvY>

# Application – Programmable Second Skin (1)

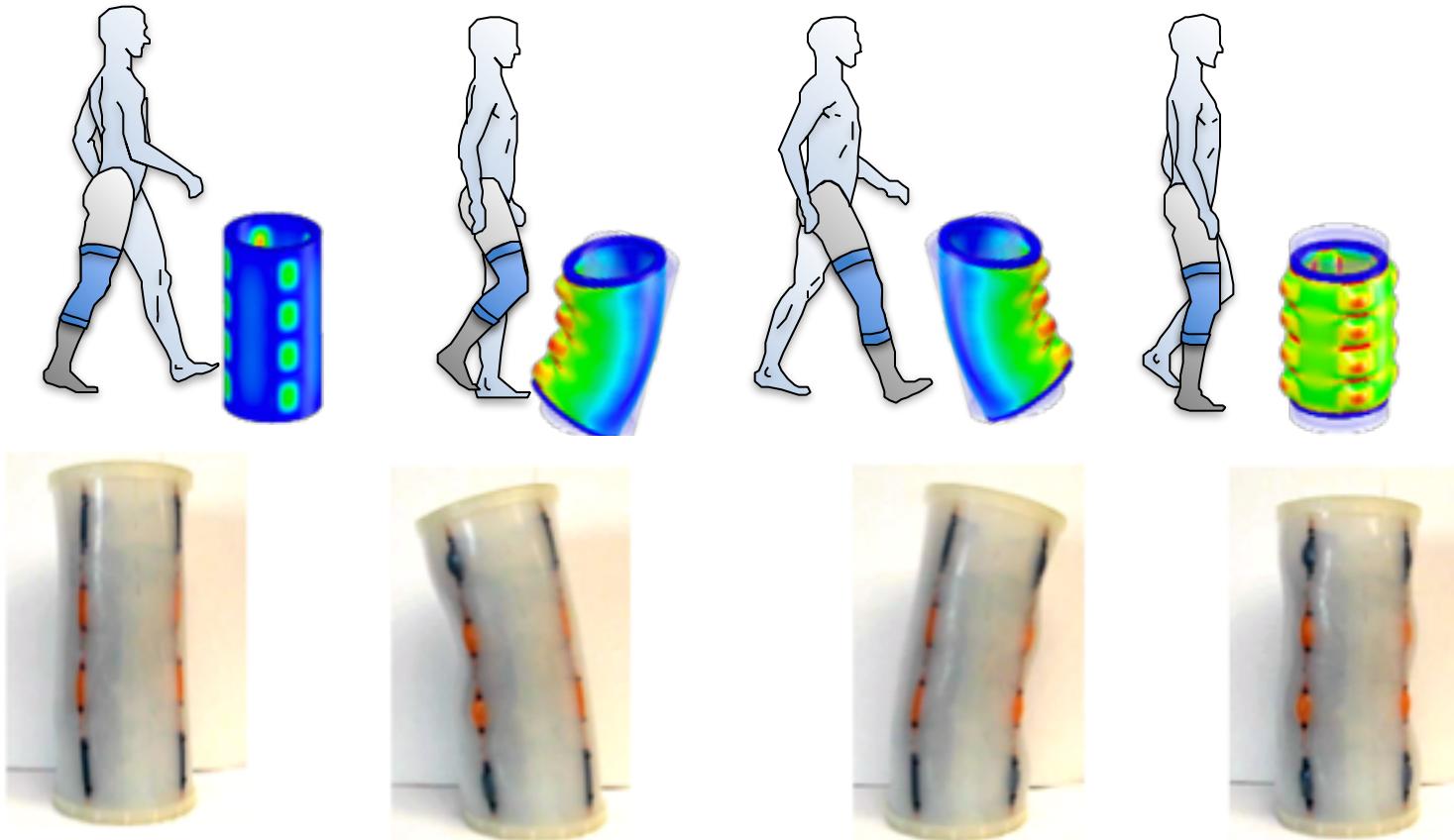


YL Park, B Chen, C. Majidi et al., *Proc. IEEE/RSJ IROS*, pp. 1595-1602, 2012.

EC Goldfield, YL Park, B Chen et al., *Ecological Psychology*, Vol. 24, No. 4, pp. 300-327, 2012.

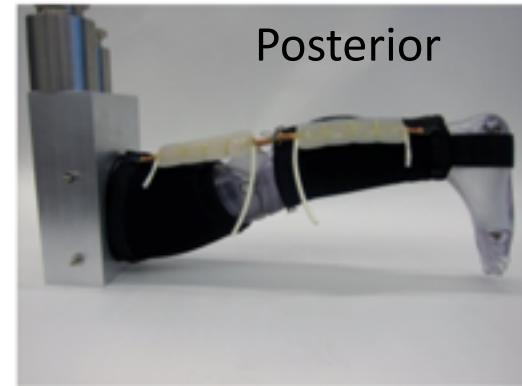
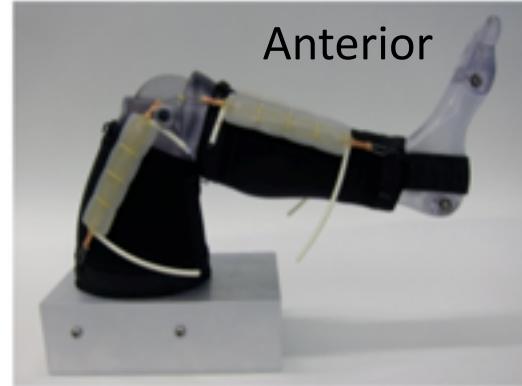
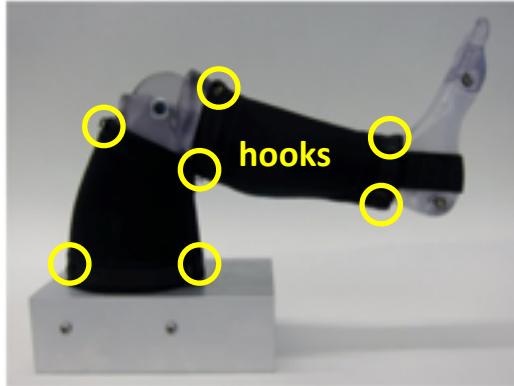
# Application – Programmable Second Skin (2)

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**Video Link:** <http://www.youtube.com/watch?v=38D8hayhUJ0>

# Application – Soft Knee Orthotic (1)

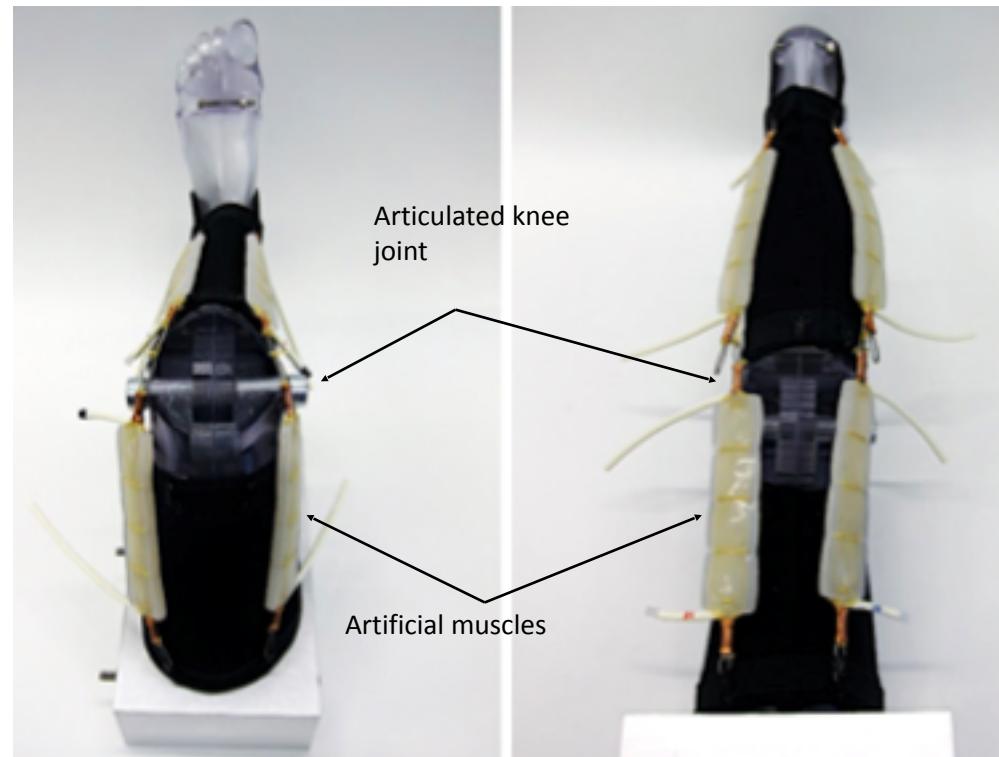
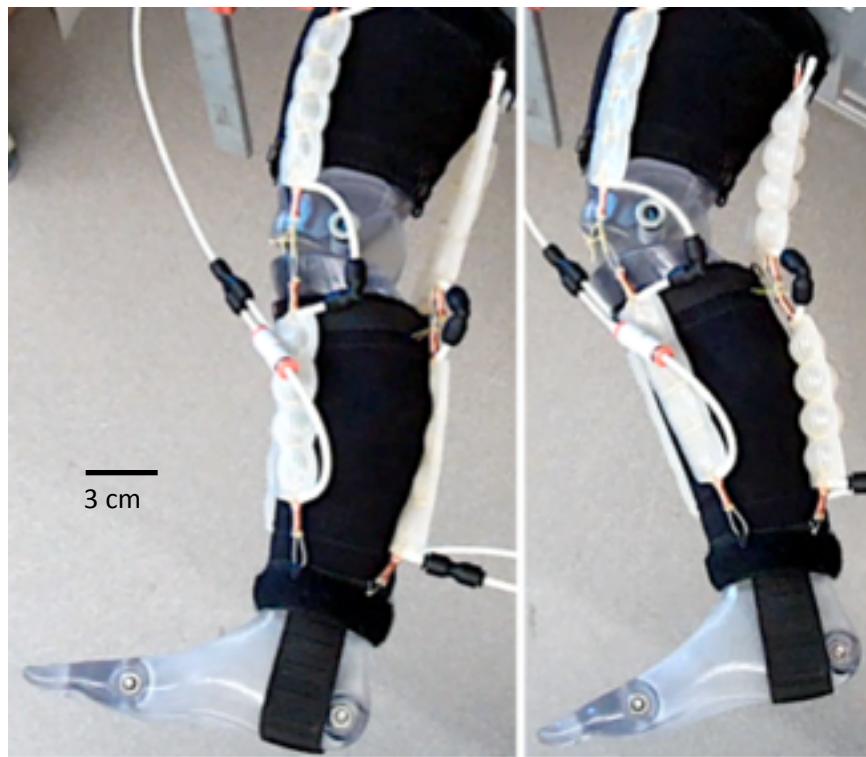


Articulated leg model  
(3D printed)

Leg sleeves

Muscle installation

# Application – Soft Knee Orthotic (2)



Y-L Park, J Santos, RJ Wood et al., *IEEE ICRA'14*, 2014.

**Video Link:** <http://www.youtube.com/watch?v=pWzoXk7KUmU>

# Application - Soft Motion Sensing Suits

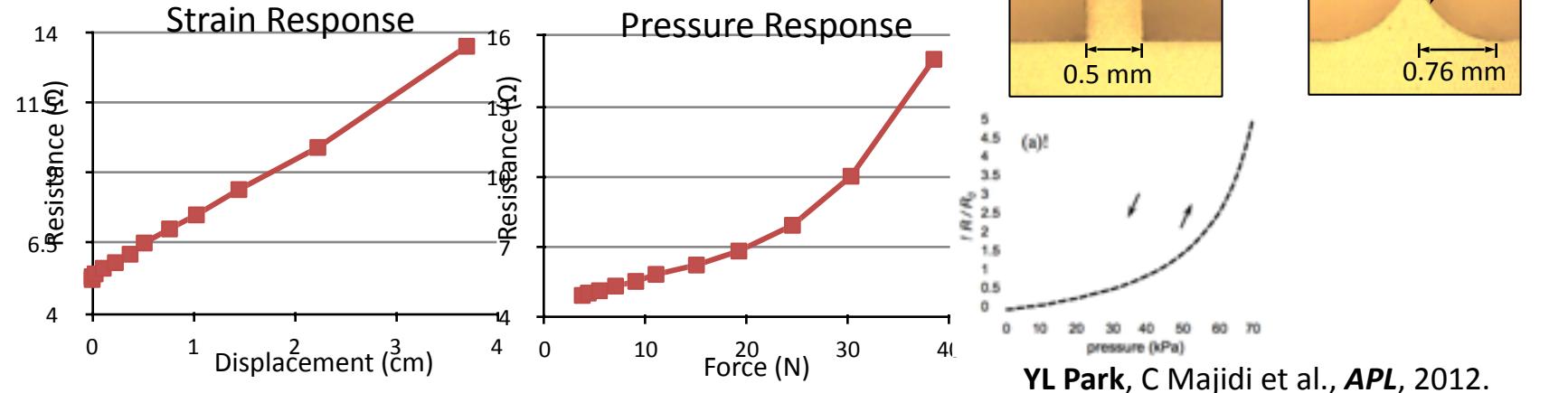


Y Menguc, Y-L Park, C Walsh et al. *Proc. IEEE ICRA'13*, 2013.

Y Menguc, Y-L Park, C Walsh et al., *International Journal of Robotics Research*, 2014.

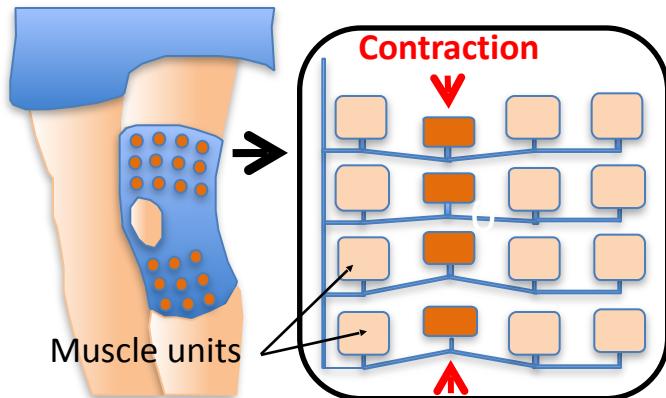
# Ongoing & Future Work

- Sensor Response Improvement



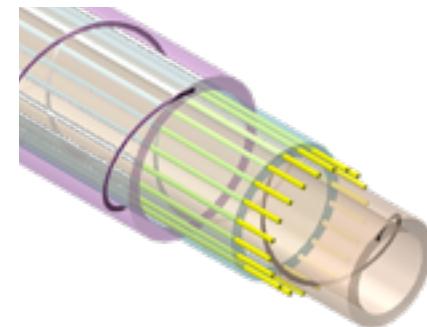
YL Park, C Majidi et al., *APL*, 2012.

- Modularized Muscle Design & Control



YL Park, B Chen, C Majidi et al., *IEEE IROS*, 2012.

- Automated Manufacturing of 3D Muscles



YL Park, RJ Wood, *IEEE Sensors Conf.*, 2013.

# Summary: Soft Actuators

---

- **Objective:**
  - Compact, soft pneumatic artificial muscle with integrated sensing
- **Enabling technologies:**
  - Bio-inspired design & manufacturing
  - Multi-layered structure
- **Results:**
  - Flat pneumatic muscles
  - Sensor integrated pneumatic muscles
- **Applications:**
  - Soft Wearable Robots for Active Assistance and Rehabilitation

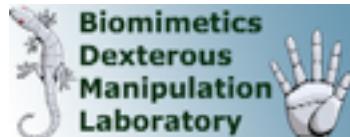
# Acknowledgement

---

- Affiliation & Collaboration:



Mechanical Engineering



HARVARD  
School of Engineering  
and Applied Sciences

WYSS INSTITUTE  
for Biologically Inspired Engineering



Self-Organizing Systems  
Research Group



Boston Children's Hospital

- Funding:



WYSS INSTITUTE  
for Biologically Inspired Engineering

# More Questions...

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Robotics Institute, Carnegie Mellon University

Soft Robotics and Bionics Lab.

(*<http://softrobotics.cs.cmu.edu>*)

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Lab: Newell-Simon Hall 4124