

Machine Touch for Dexterous Robotic and Prosthetic Hands

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syntouch

Tactile feedback is essential for dexterity.

Humanlike tactile sensing is NOT about force sensors:

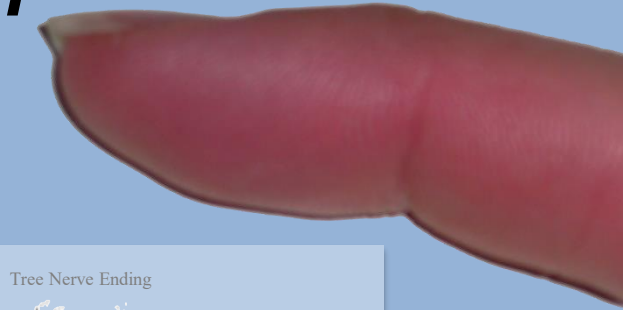
1. Exploratory movements
2. Mechanical properties
3. Multimodal sensing



Biological Transducers

Cutaneous Touch

Force &
Deformation



Tree Nerve Ending



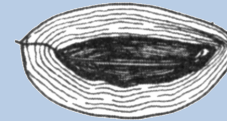
Thermal

Meissner Corpuscle



Vibrations

Pacinian Corpuscle



Enabled by Exploratory Movements...

Proprioceptive Touch

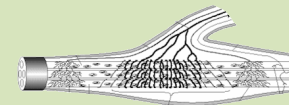
Actuator
Force



Golgi Tendon Organ



Muscle Spindle



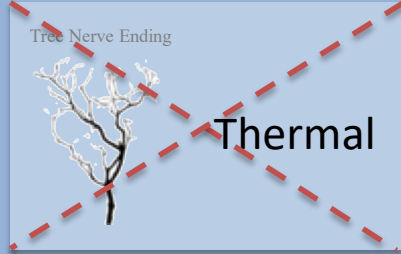
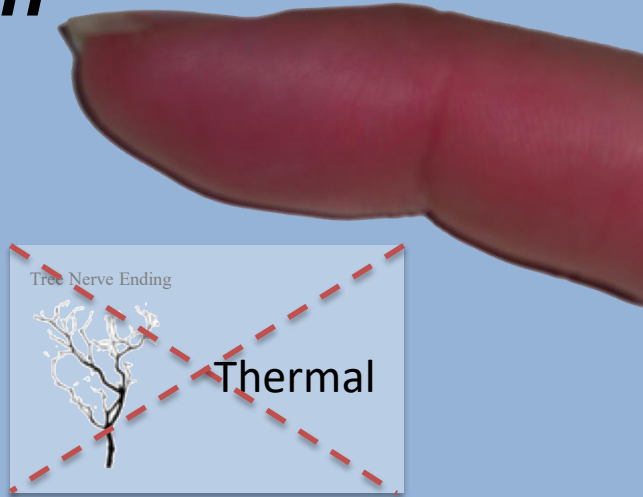
Position
& Velocity

Engineered Transducers

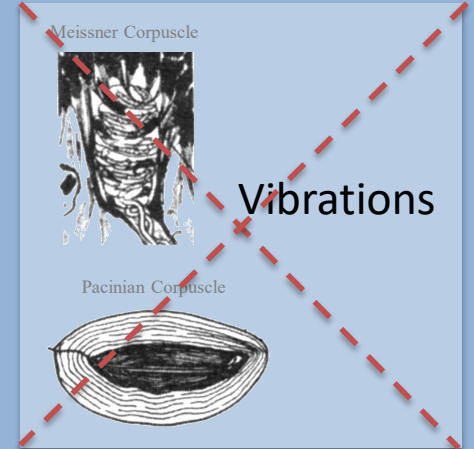
Cutaneous Touch

"Taxel"
Normal Force
Arrays

Force &
Deformation



Thermal



Vibrations

Enabled by Exploratory Movements...

Proprioceptive Touch

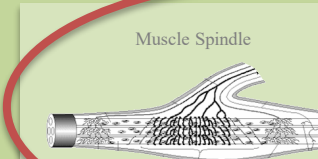
Actuator
Force



Strain Gages

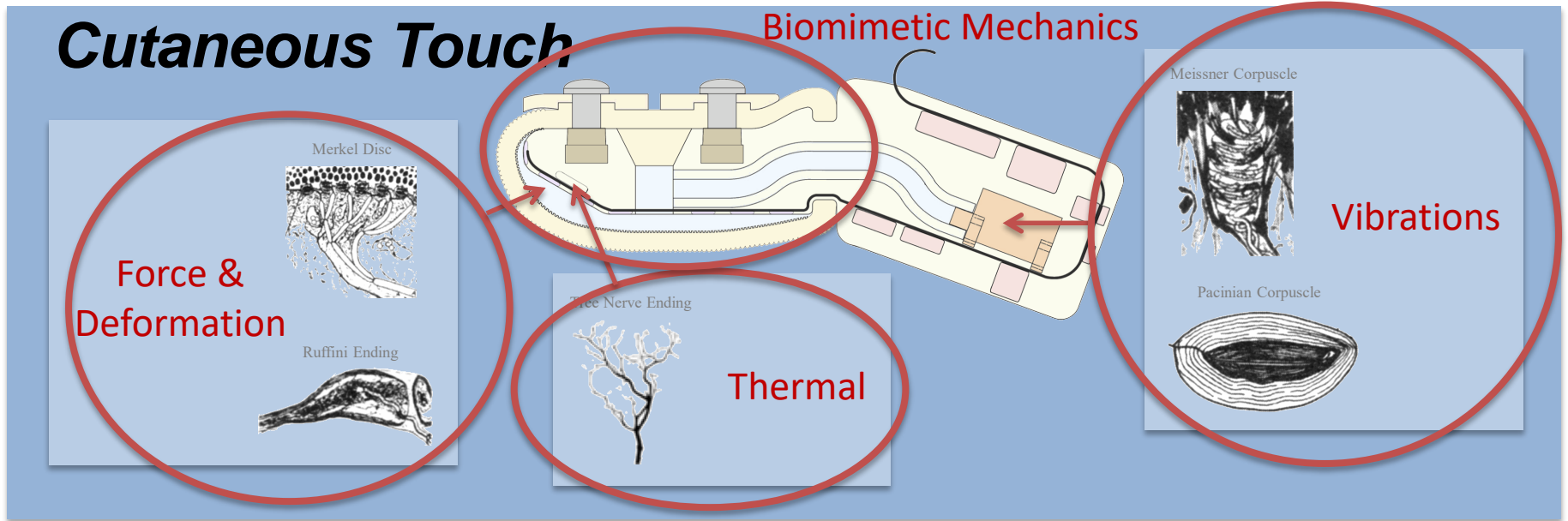


Position Encoders



Position
& Velocity

The BioTac Design Approach



BioTac developers and SynTouch founders

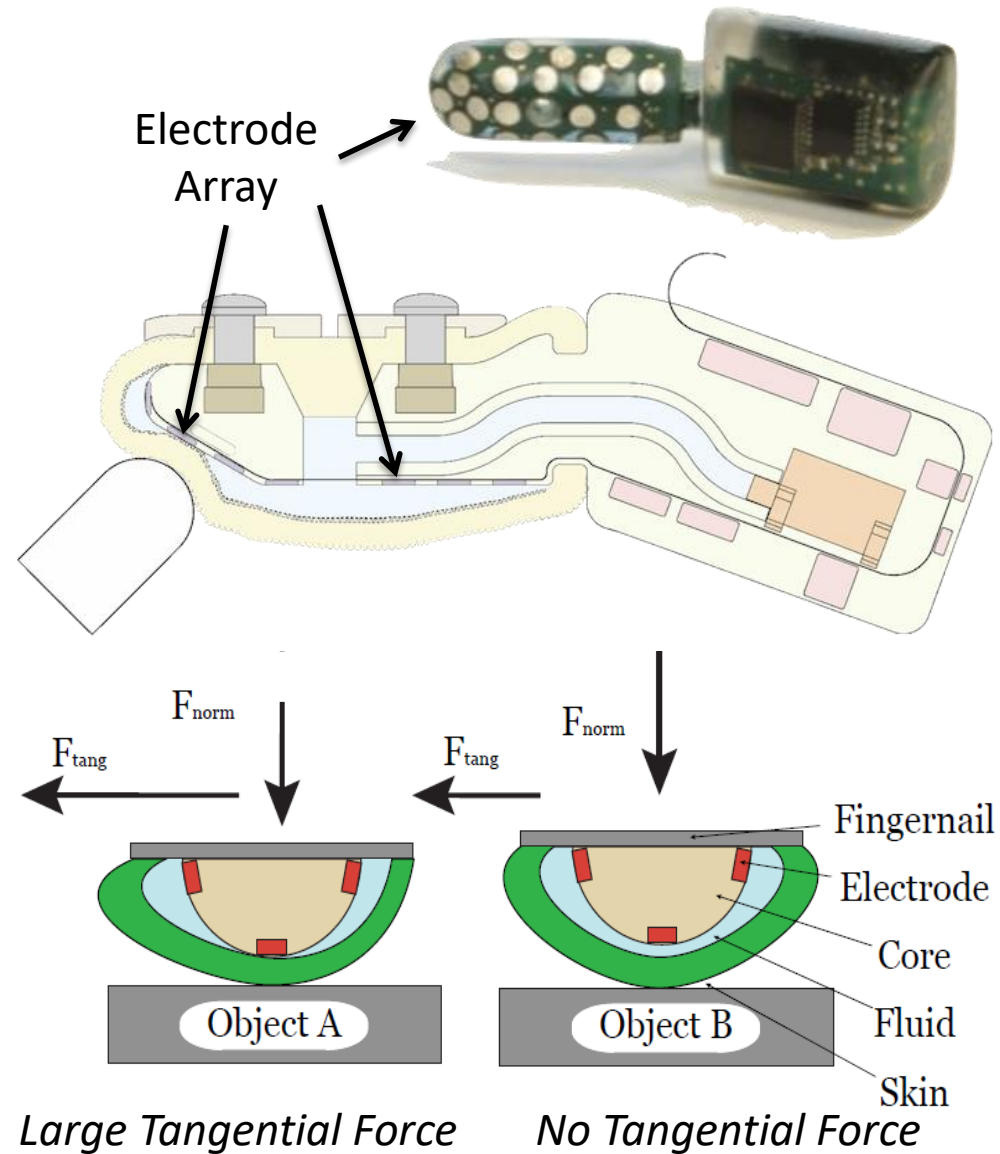
Jeremy Fishel, Nick Wettels, Gary Lin, Ray Peck, Matt Borzage

Contributing researchers

Roland Johansson, Veronica Santos, Dipayon Roy, Blaine Matulevich, Vikram Pandit, Danfei Xu, Zhe Su, Lorenzo Smith, Todd Erickson, Morelle Arian, Alex Blaine, Meghan Jimenez, Rahman Davoodi, Kelsey Muller, Alexandra Llic

Deformation Sensing

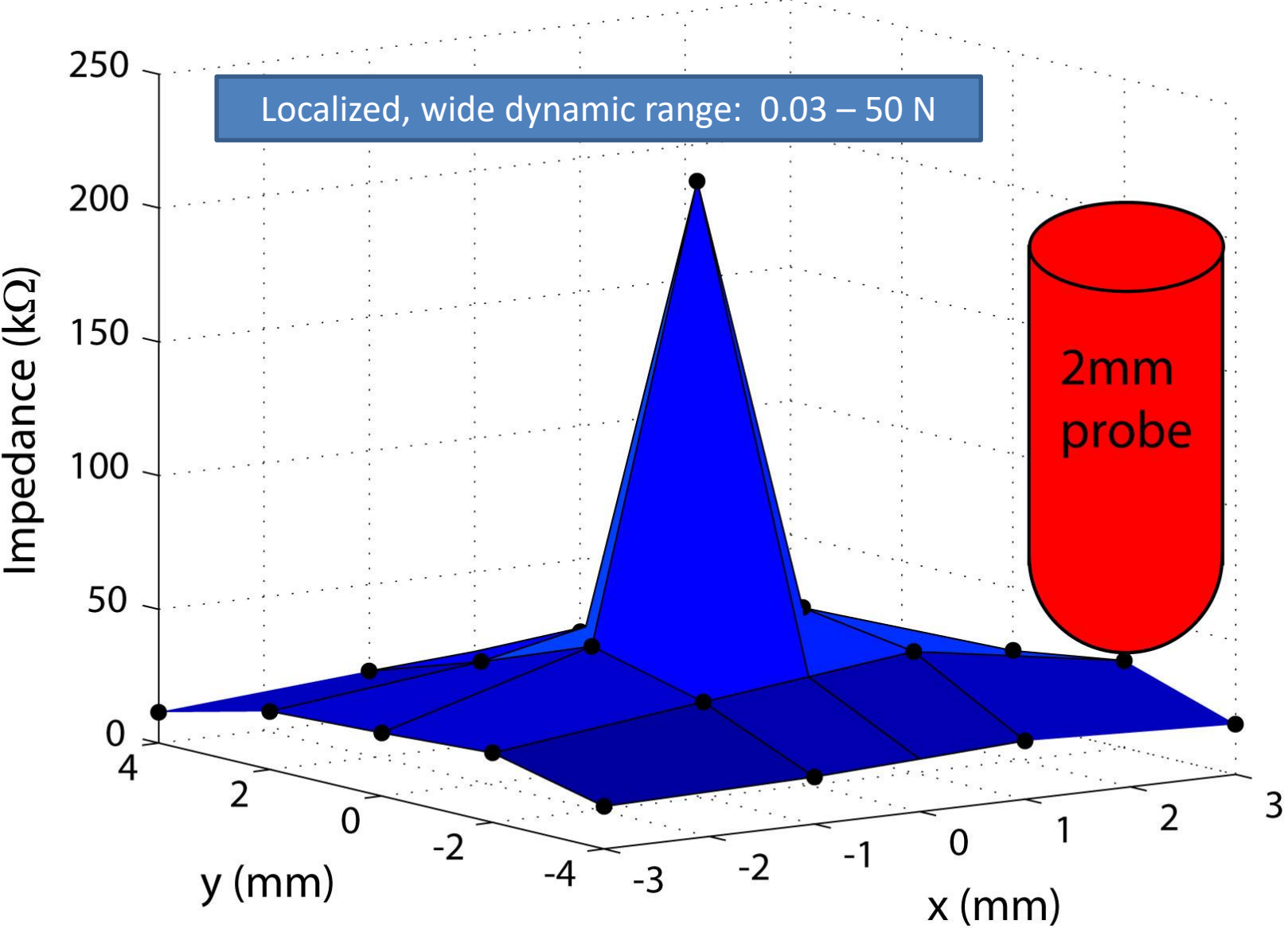
- Forces deform skin and fluid
- Impedance changes are sensed by electrodes
- Raw data can be used with machine learning techniques to extract features:
 - Tri-Axial Force
 - Point of Contact
 - Radius of Curvature
 - ...



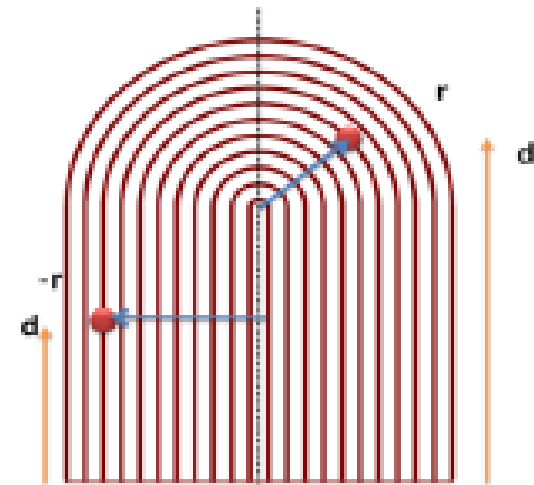
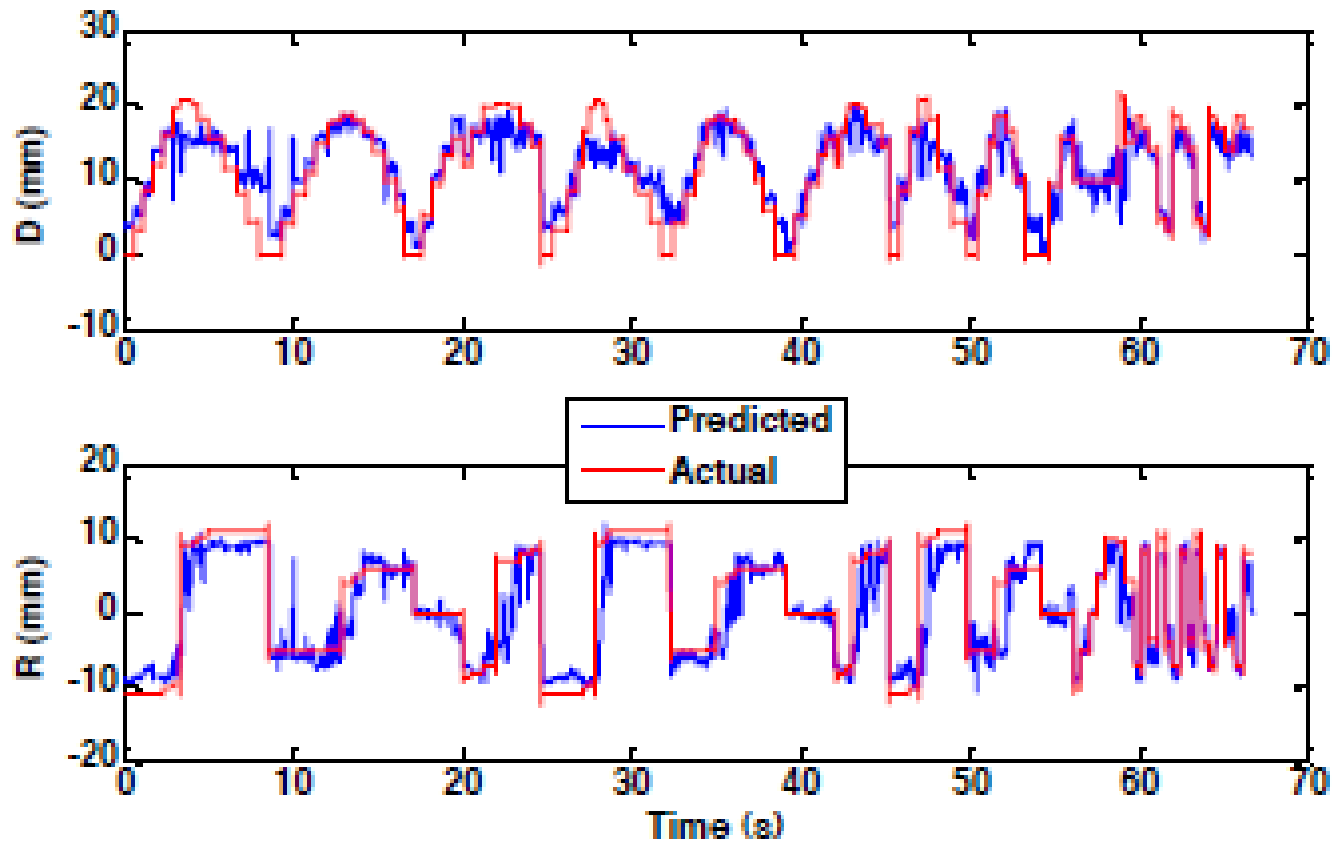
Wettels, Popovic, Santos, Johansson, Loeb.
Advanced Robotics (2008)

Wettels, Smith, Santos, Loeb. *IEEE Intl Conf
Biomed Robotics and Biomechatronics* (2008)

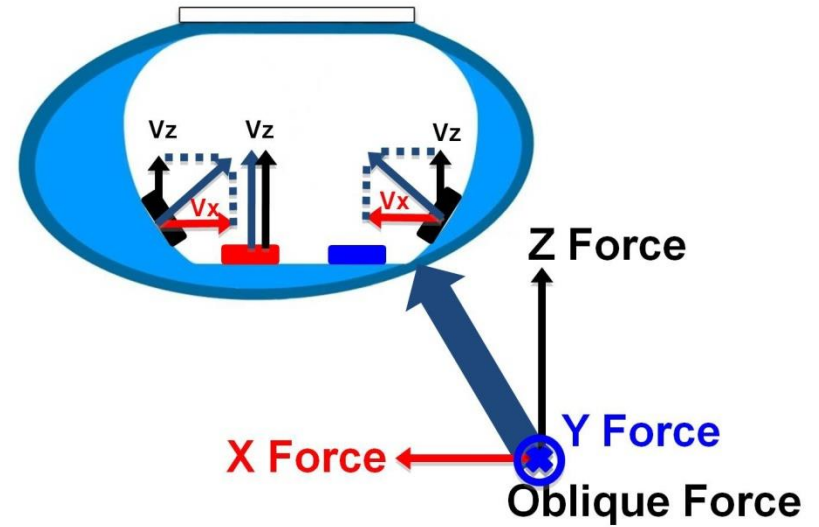
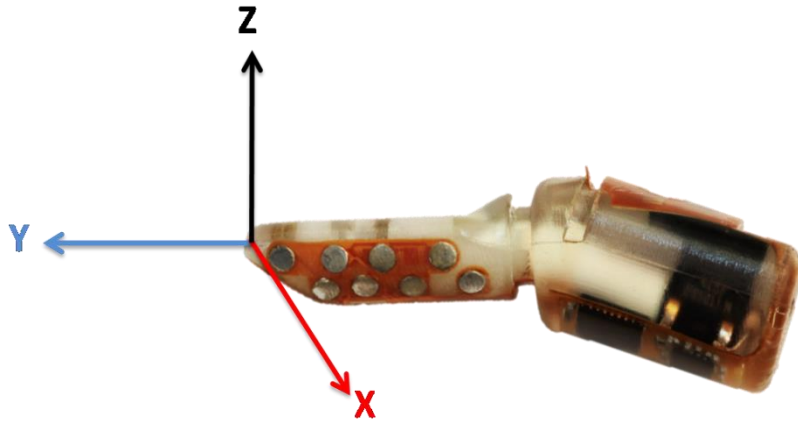
Impedance: Probing about an Electrode



Point of Application Computation (post Lowess Filtering)

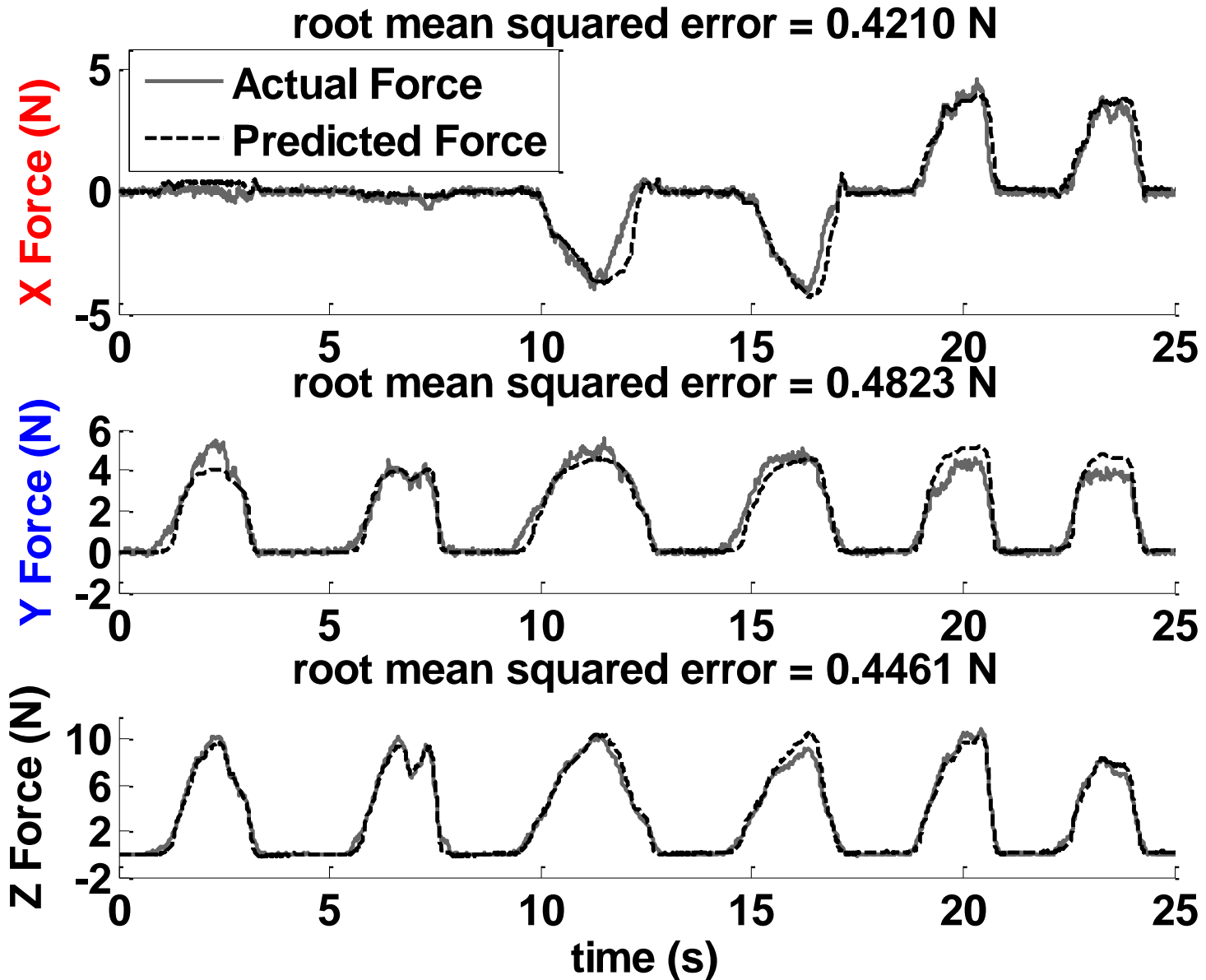


Tri-axial force vectors extraction on BioTac

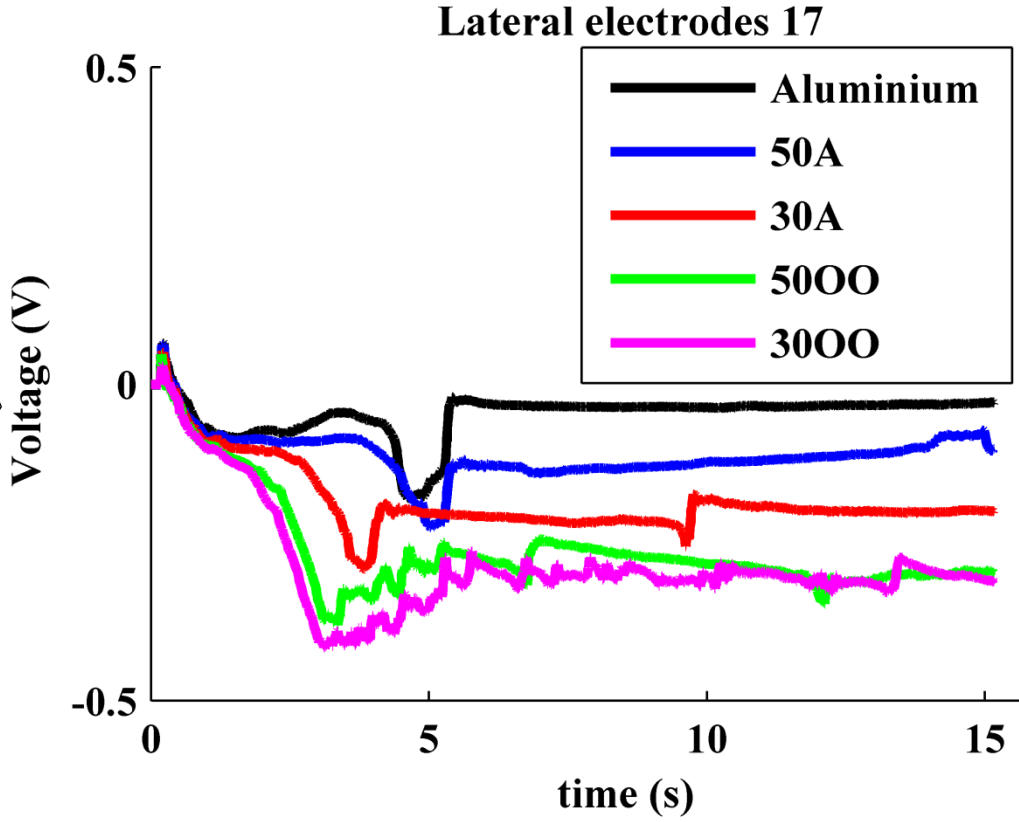
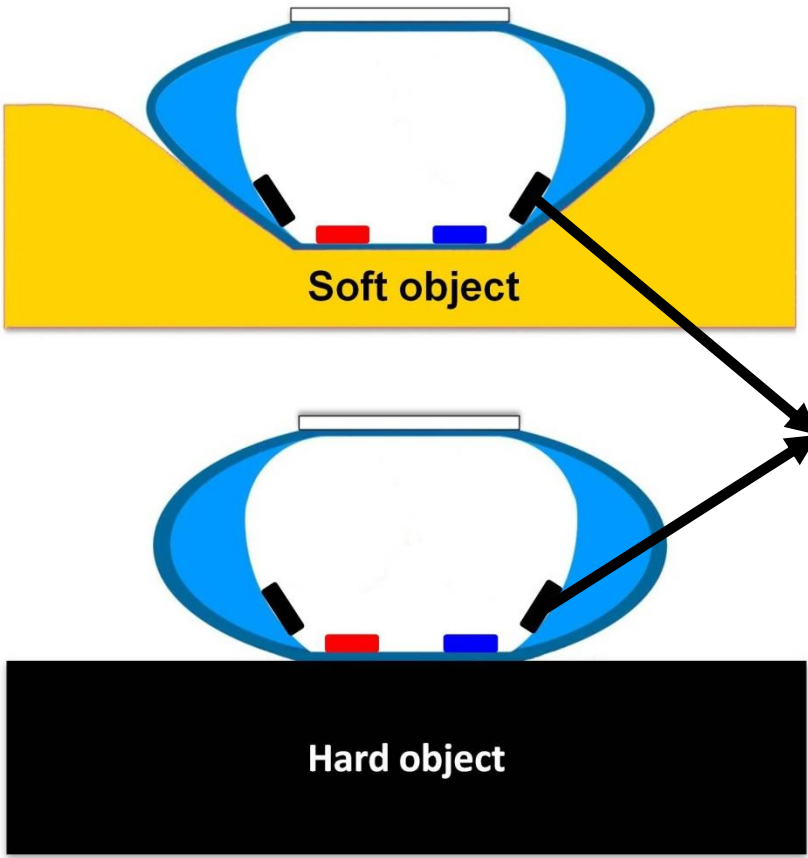


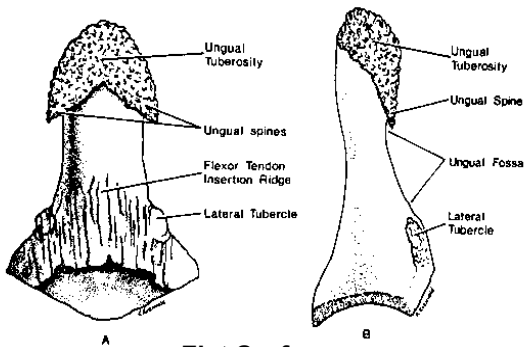
$$\begin{bmatrix} F_x \\ F_y \\ F_z \end{bmatrix} = \begin{bmatrix} S_x & 0 & 0 \\ 0 & S_y & 0 \\ 0 & 0 & S_z \end{bmatrix} \times \begin{bmatrix} N_{1,x} & \dots & N_{19,x} \\ N_{1,y} & \dots & N_{19,y} \\ N_{1,z} & \dots & N_{19,z} \end{bmatrix} \times \left(\begin{bmatrix} E_1 \\ \dots \\ E_{19} \end{bmatrix} - \begin{bmatrix} E_{1,rest} \\ \dots \\ E_{19,rest} \end{bmatrix} \right)$$

Force vector extraction and control

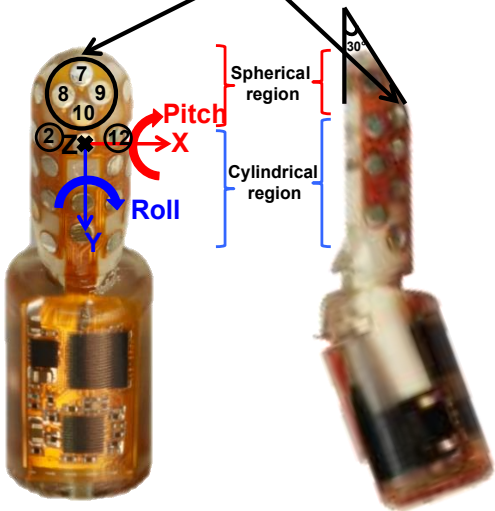


The skin enveloping lateral impedance electrodes provides compliance and radius-of-curvature discrimination.

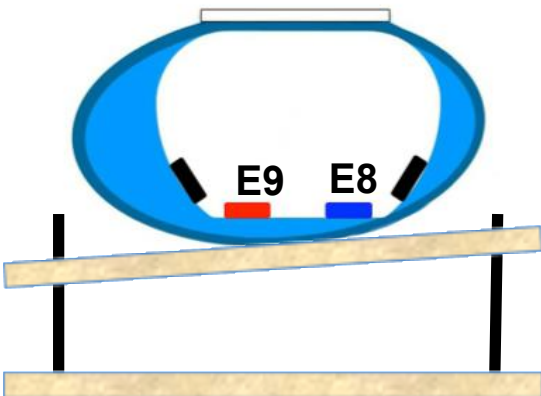




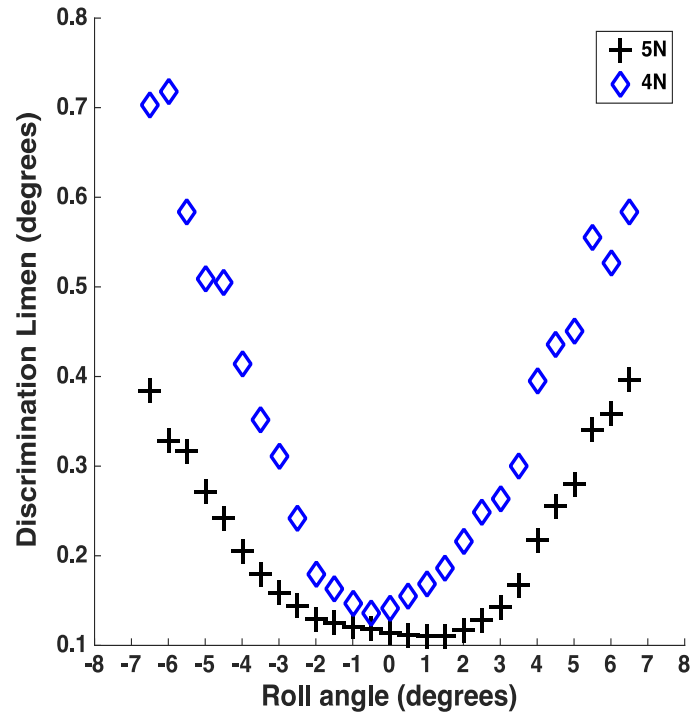
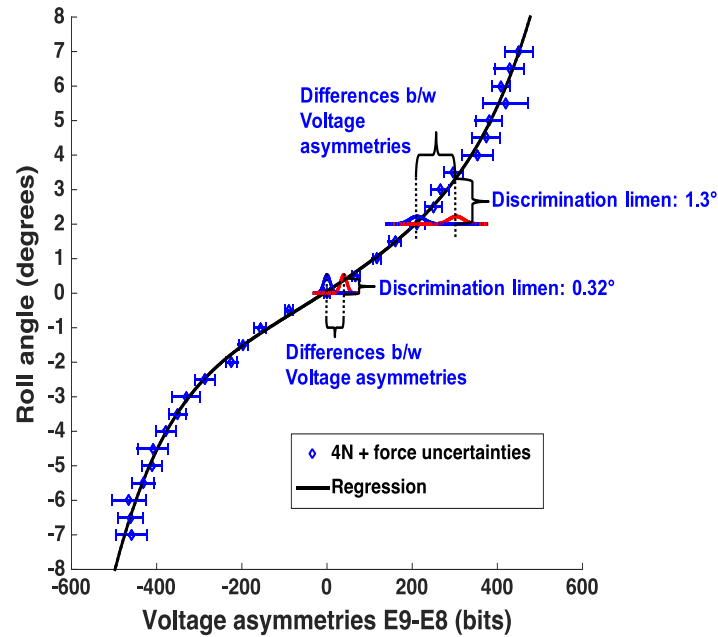
Flat Surface



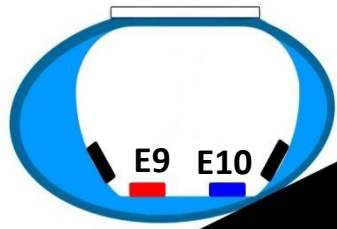
Apical Tuft as a Vernier Tilt Sensor



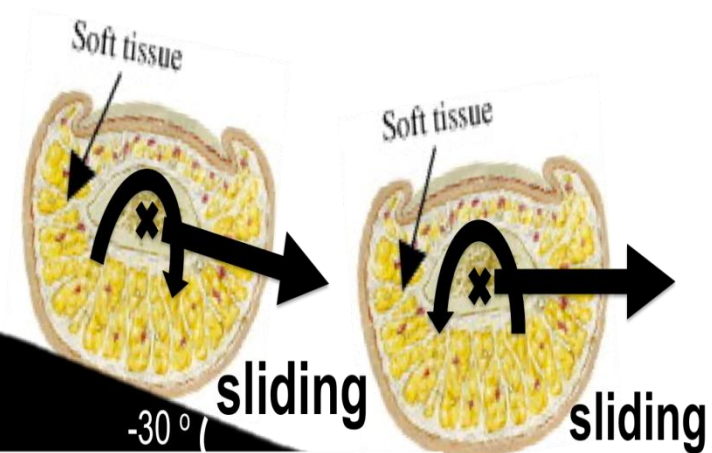
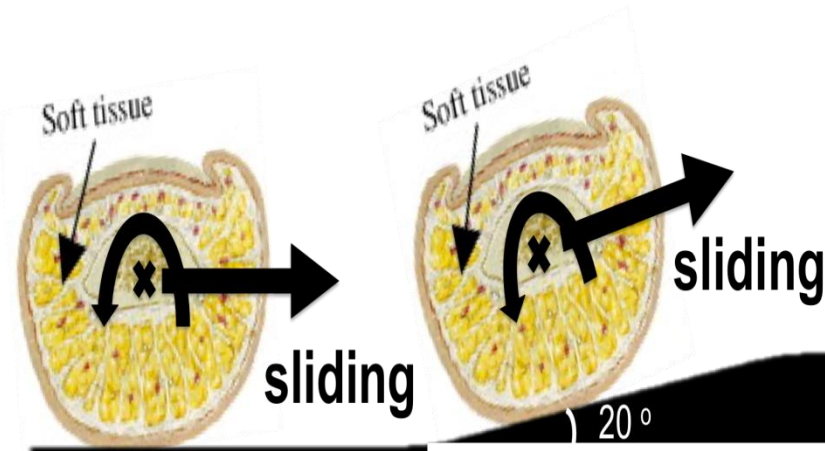
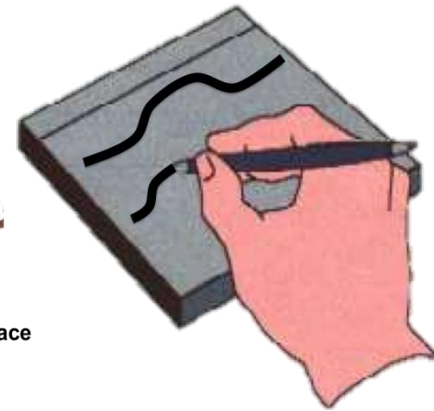
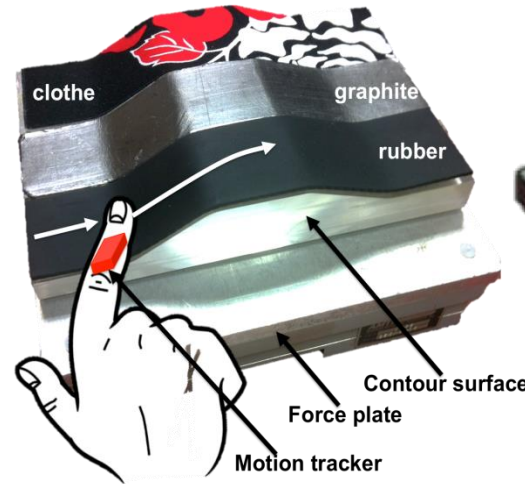
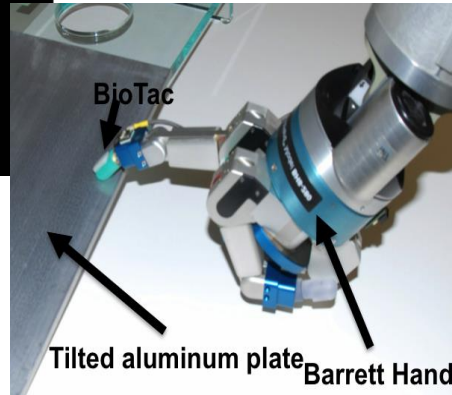
*Su, Z., Schaal, S. and Loeb, G.E.
Surface tilt perception with a
biomimetic tactile sensor
BioRob 2016, Singapore*



Exploring Complex Shapes: Deconvolving Contour and Friction



Tilted Object

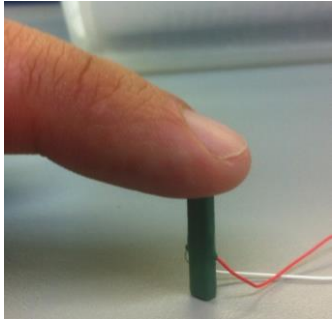
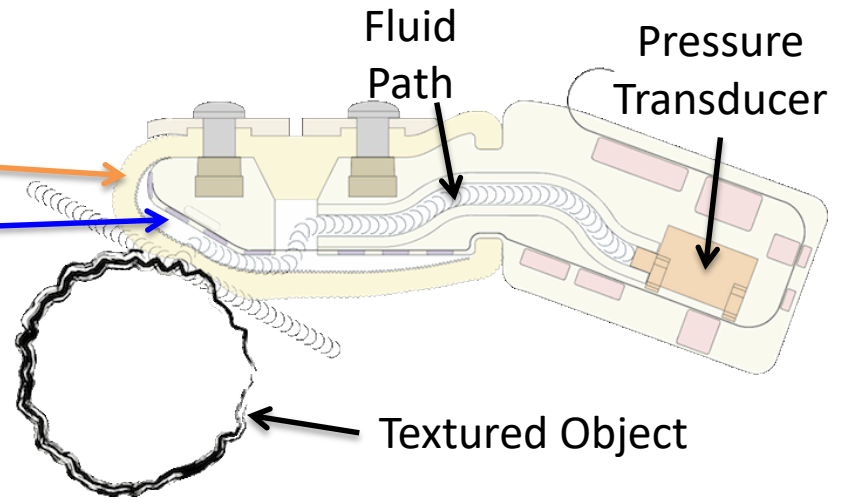


Vibration Sensitivity

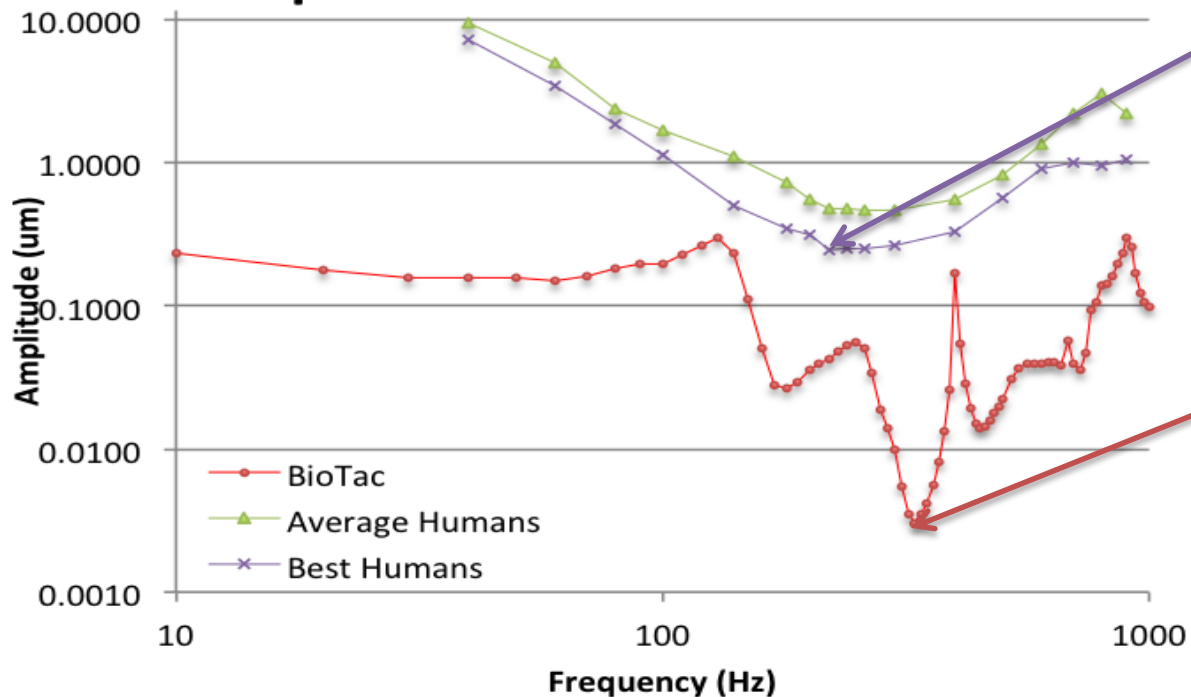
Similar size, shape and structure as the human fingertip

Similar mechanical properties and dynamic response as the human finger

Flexible skin
over liquid
"pulp"



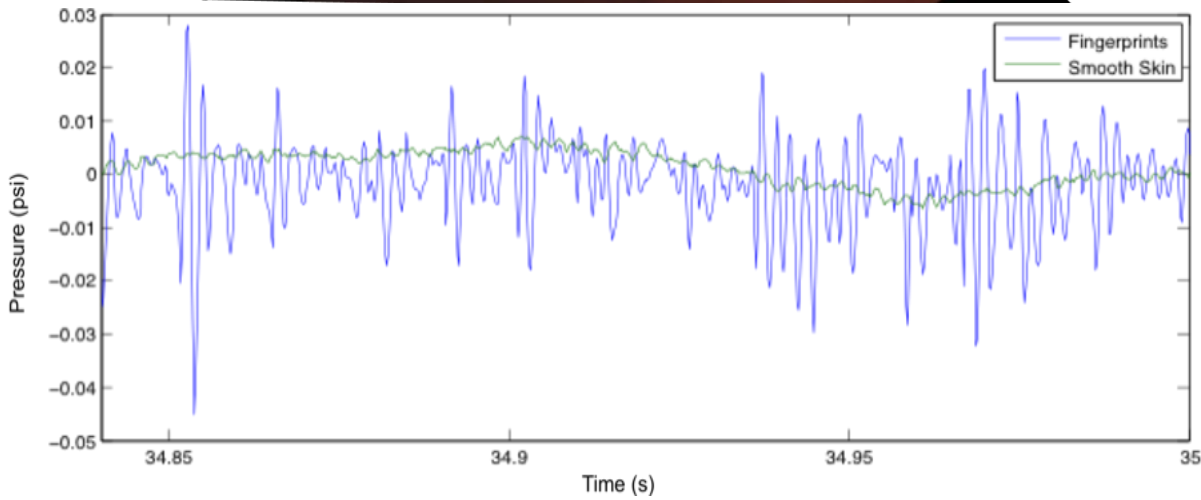
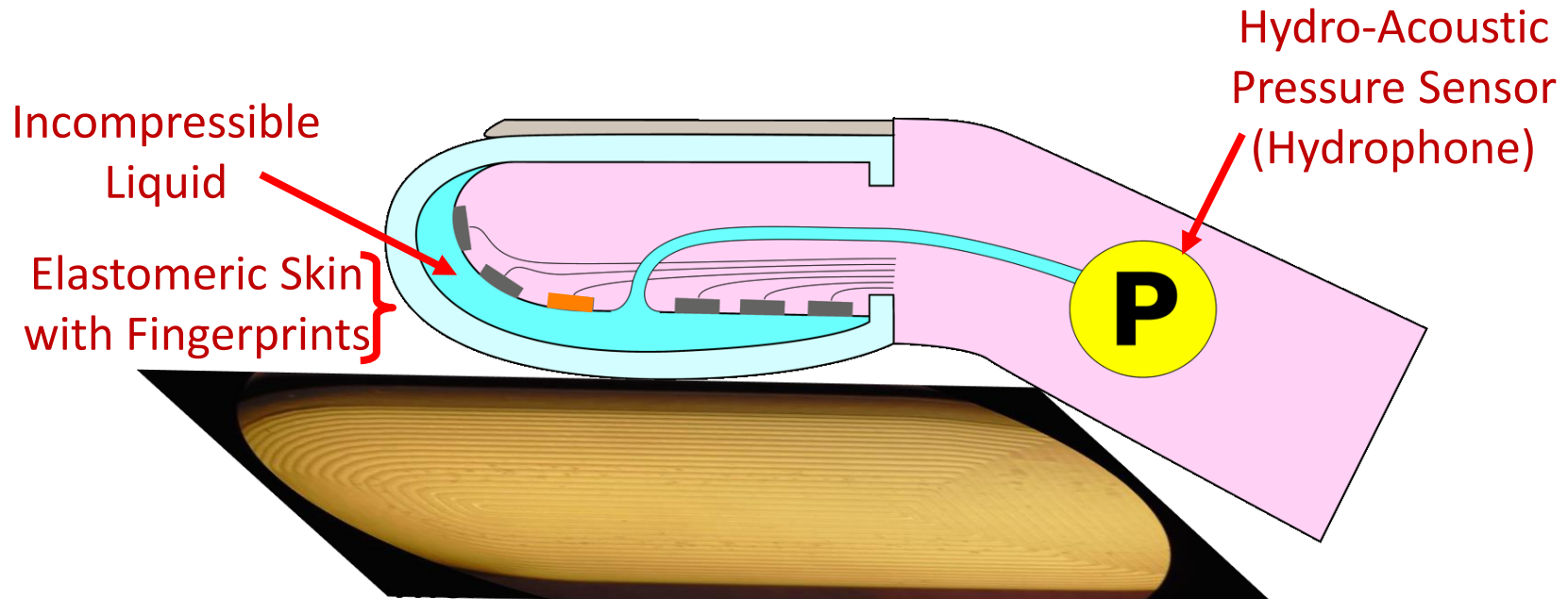
Perceptual Thresholds to Vibration



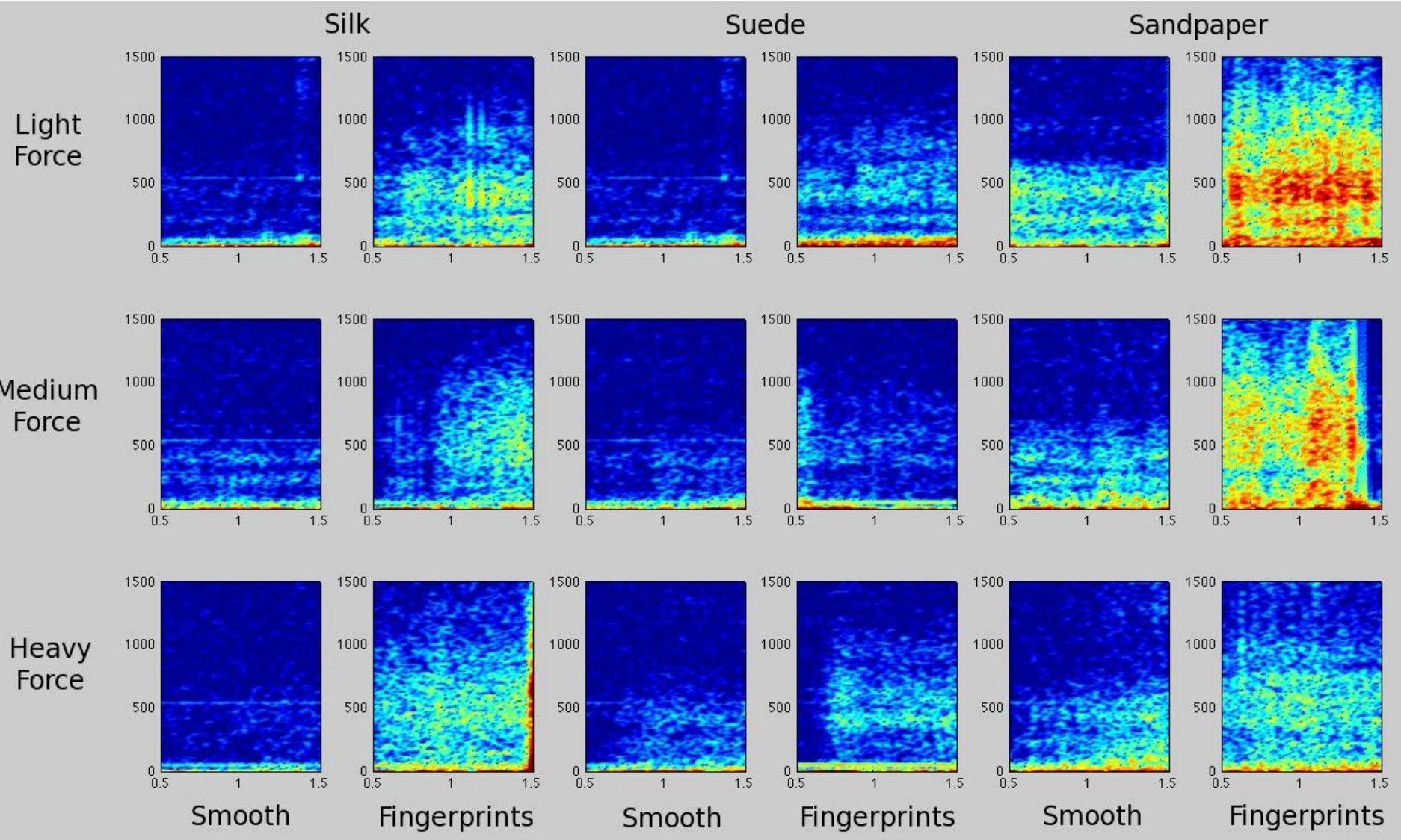
Humans
200 nm

BioTac
3 nm

Fingerprints Greatly Enhance Sliding Vibration Amplitude



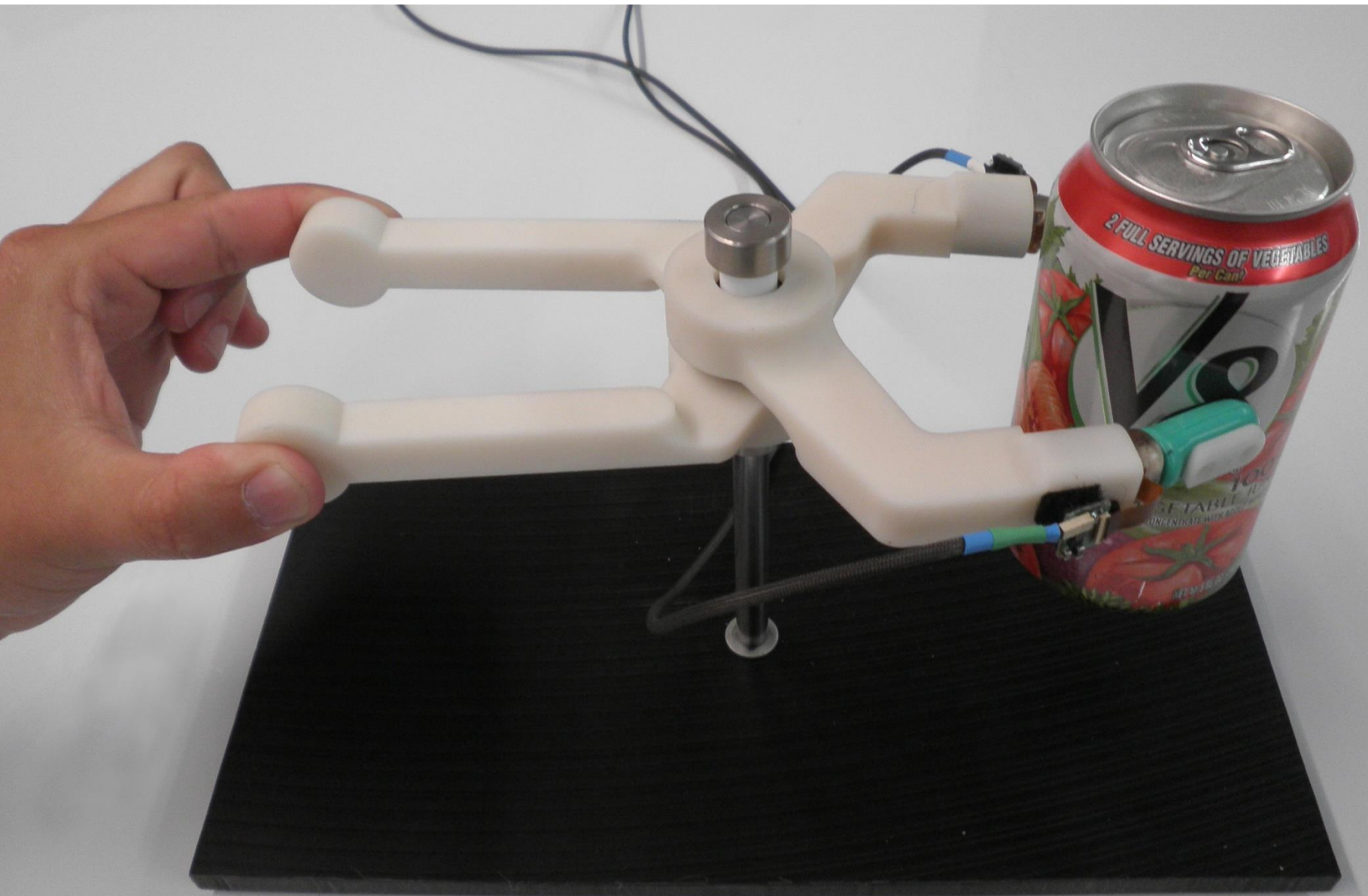
Fingerprints Enhance Vibration Spectra



When is Tactile Sensing Necessary?

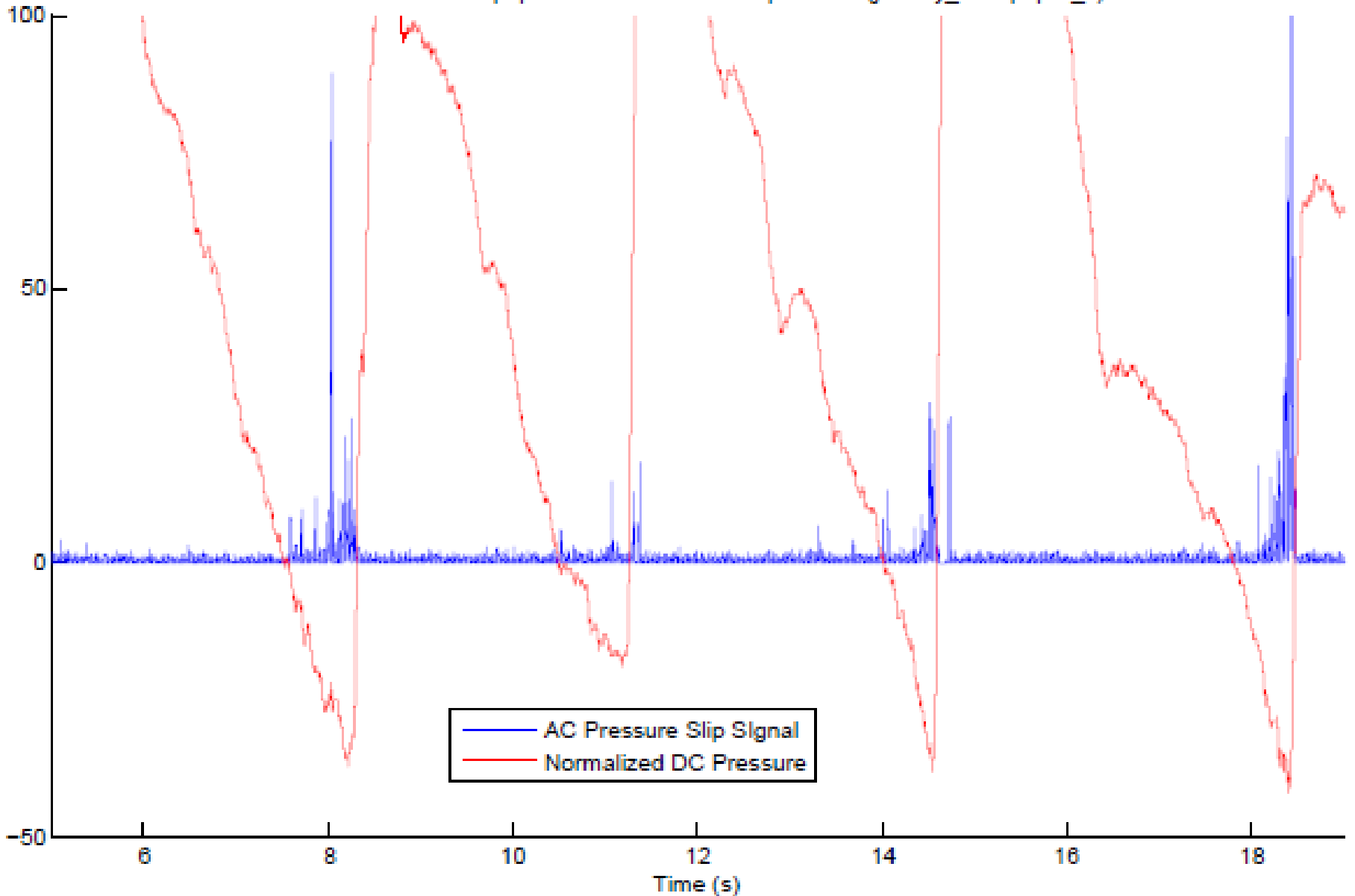
- Dexterous Manipulation = *“Perception for Action”*
 - Contact timing
 - Grip adjustment
 - Slip detection
- Object Characterization = *“Action for Perception”*
 - Identify without vision
 - Anticipate handling properties
- Utility of related objects = *“Affordances”*

Incipient Slip and Grip Adjustment



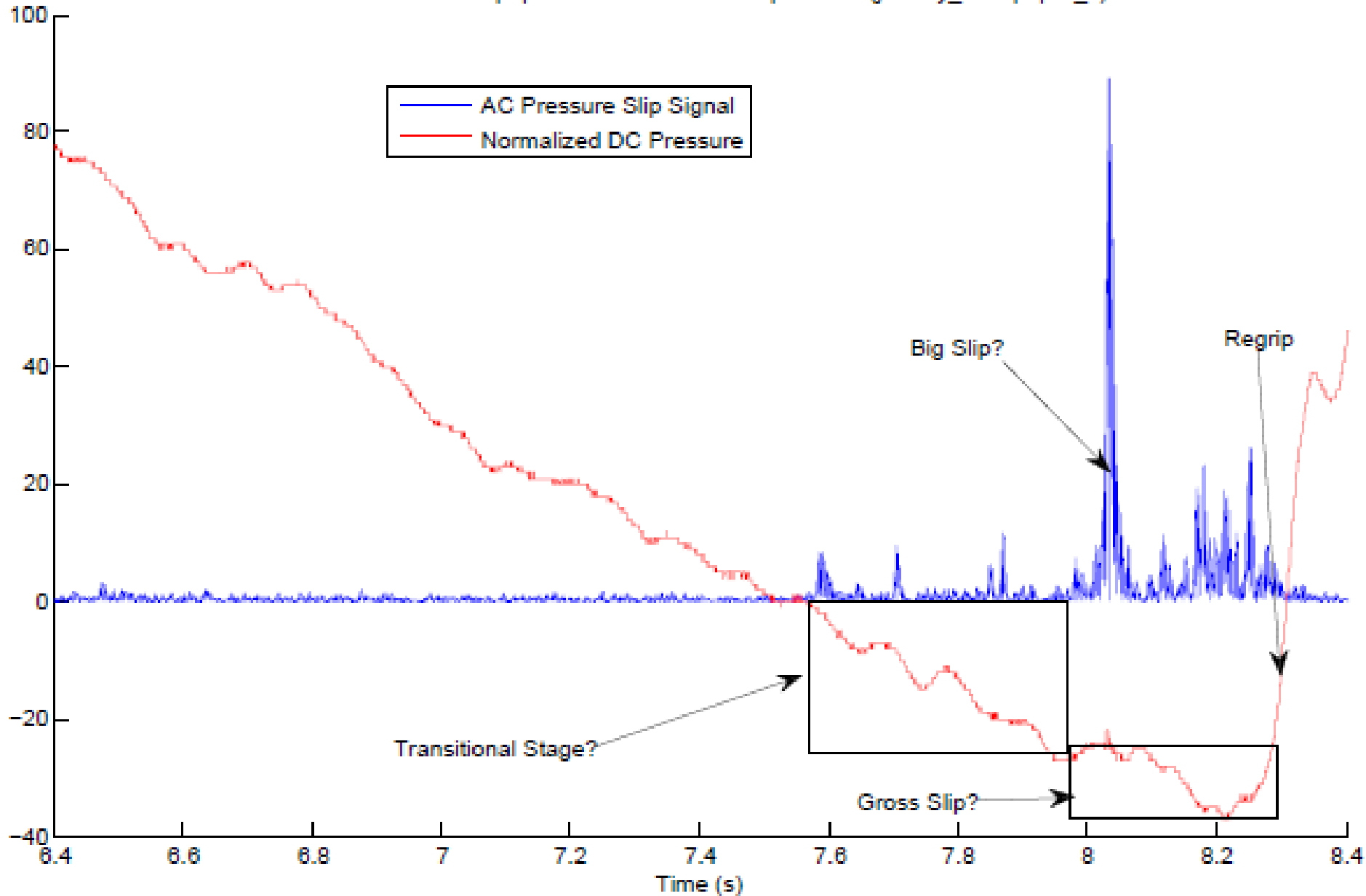
Incipient Slip Detection During Tremor-Grip

Vertical Sandpaper Tremor Scissors Experiment (jeremy_sandpaper_v)



Incipient Slip Detection During Tremor-Grip

Vertical Sandpaper Tremor Scissors Experiment (jeremy_sandpaper_v)



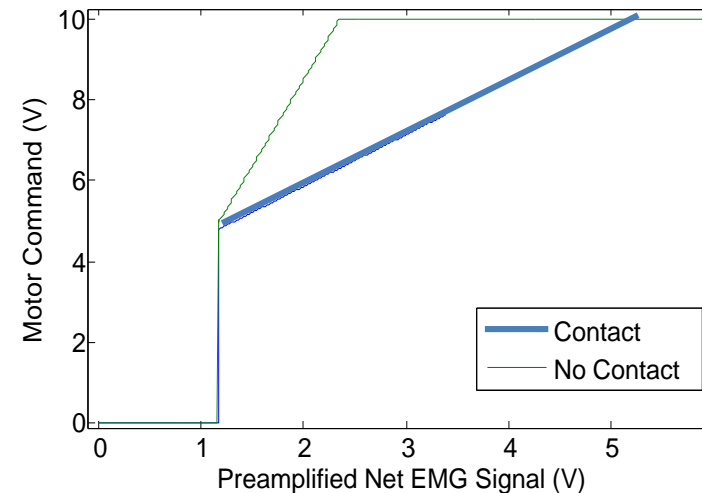
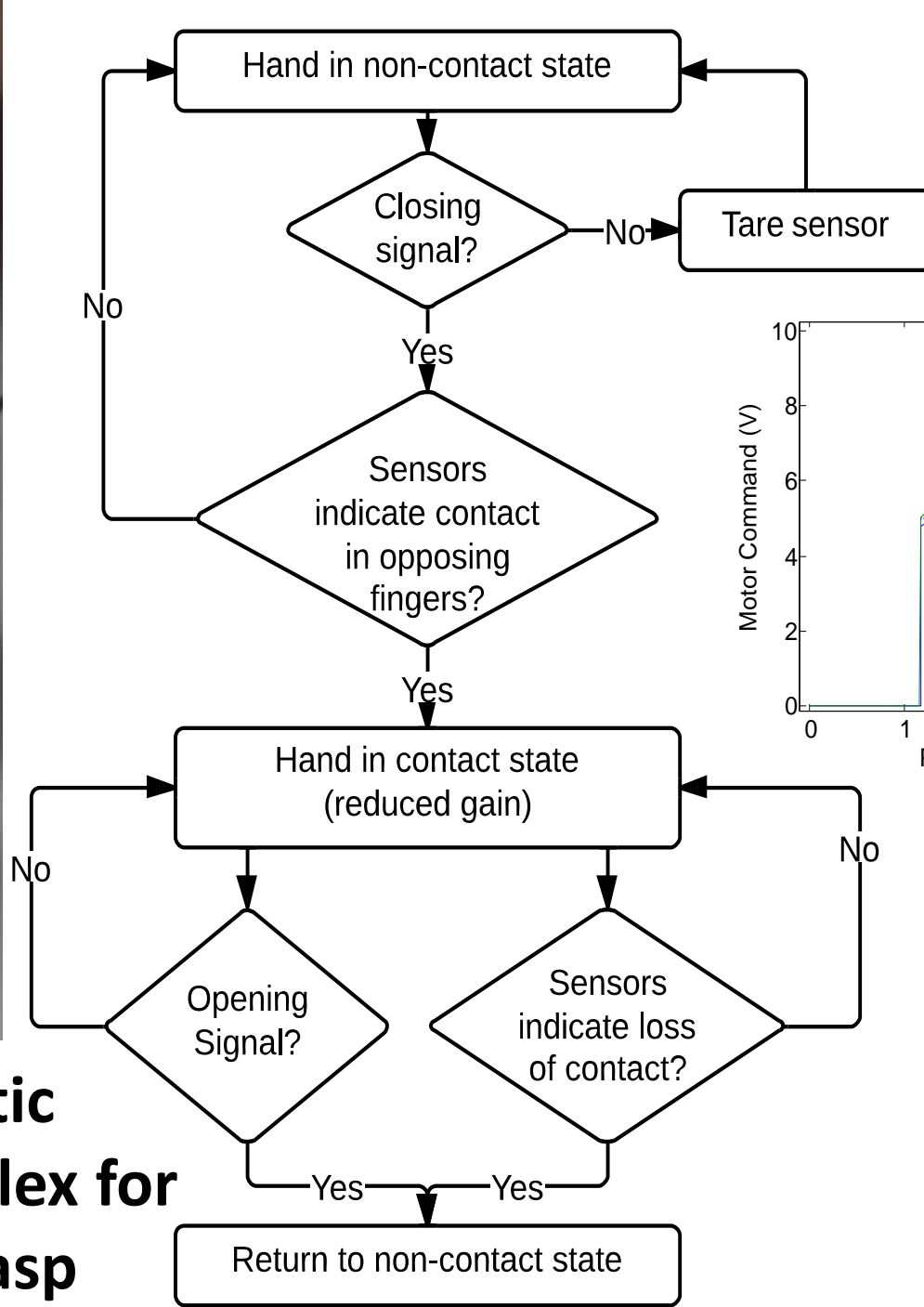
Perception for Action: Fragile Grasp



OttoBock Health Care

Prosthetic hands typically operate with the motors stalling on objects with high forces (up to 100N).

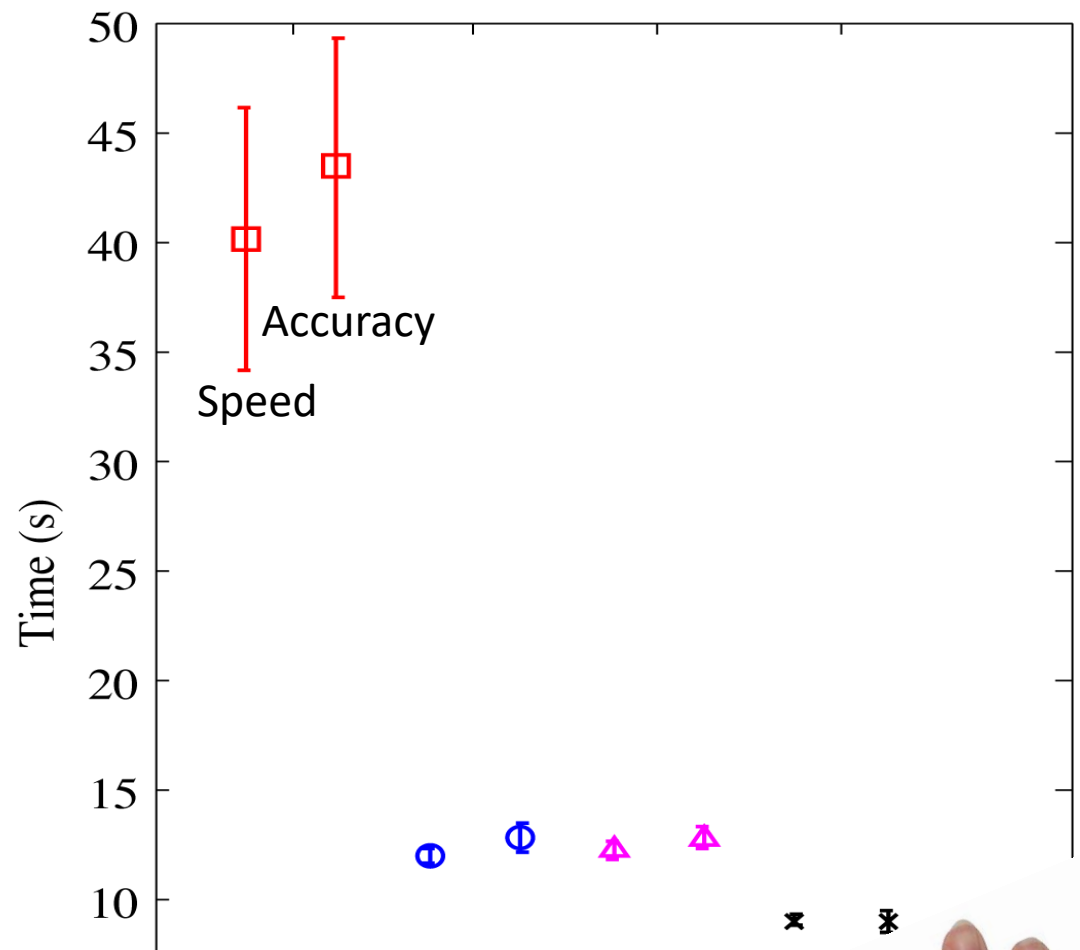
It is very difficult to grasp fragile objects without intense visual feedback to control finger position.



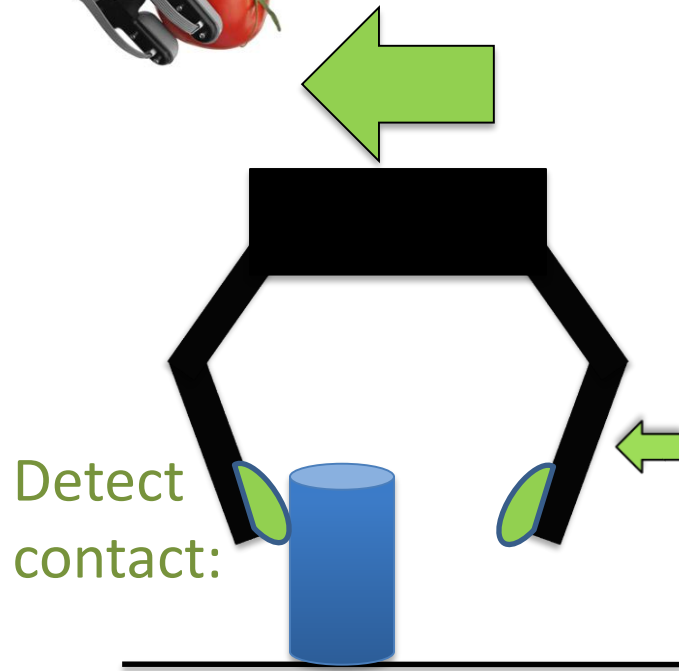
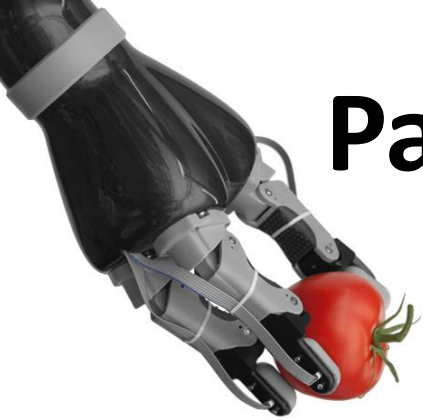
Biomimetic Inhibitory Reflex for Fragile Grasp

*Blaine Matulevich,
Vikram Pandit,
Jeremy Fishel*

Performance on cracker task



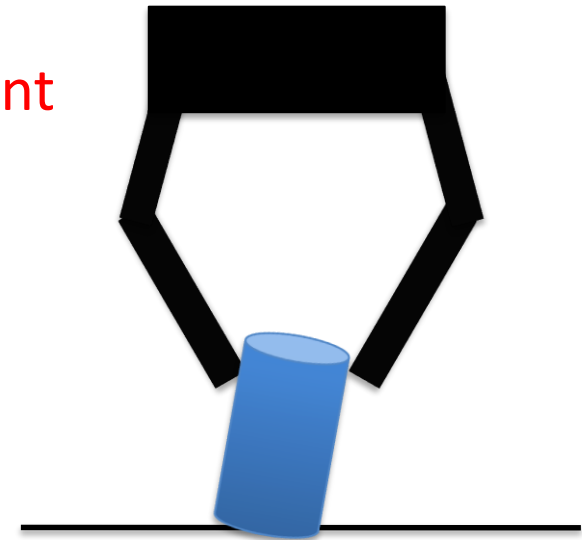
Part Misalignment Mitigation



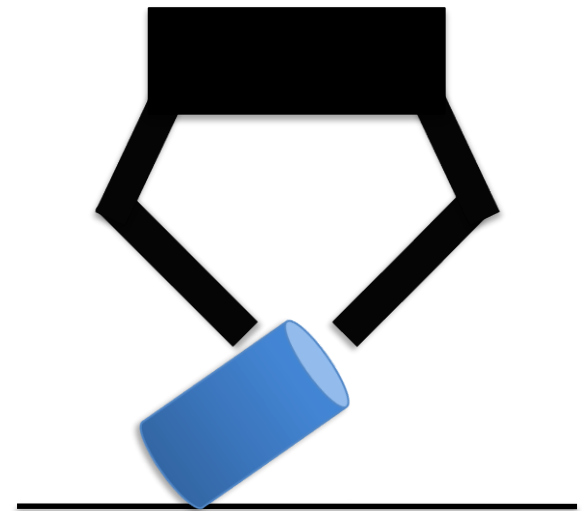
Detect contact:

Translate wrist or adjust finger to avoid:

Displacement


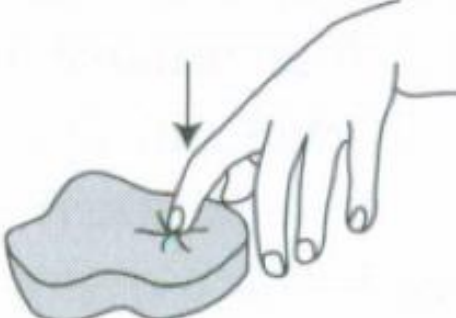


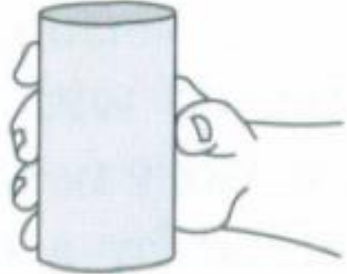



Ejection



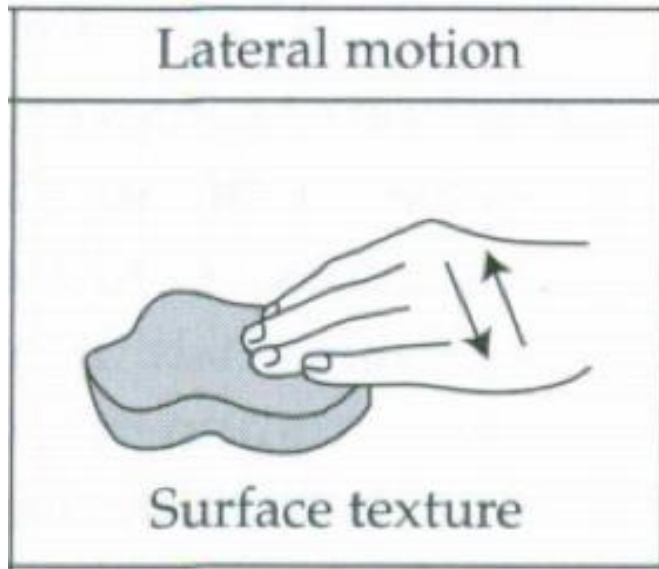
Actions for Perception

Identifying Objects by Touch

Static contact	Pressure	Lateral motion
 <p>Temperature</p>	 <p>Hardness</p>	 <p>Surface texture</p>
Contour following	Enclosure	Unsupported holding
 <p>Global shape, exact shape</p>	 <p>Global shape, volume</p>	 <p>Weight</p>

Source: S. Najarian, et al. (2009) "Artificial Tactile Sensing in Biomedical Engineering".

Test: Artificial Texture Discrimination



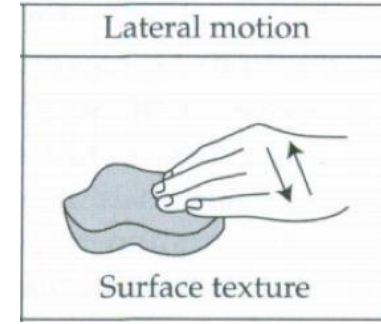
Texture
Discrimination
How?

Exploratory Movements
Which Ones?



Artificial Texture Discrimination

Requirements: *Biomimicry*

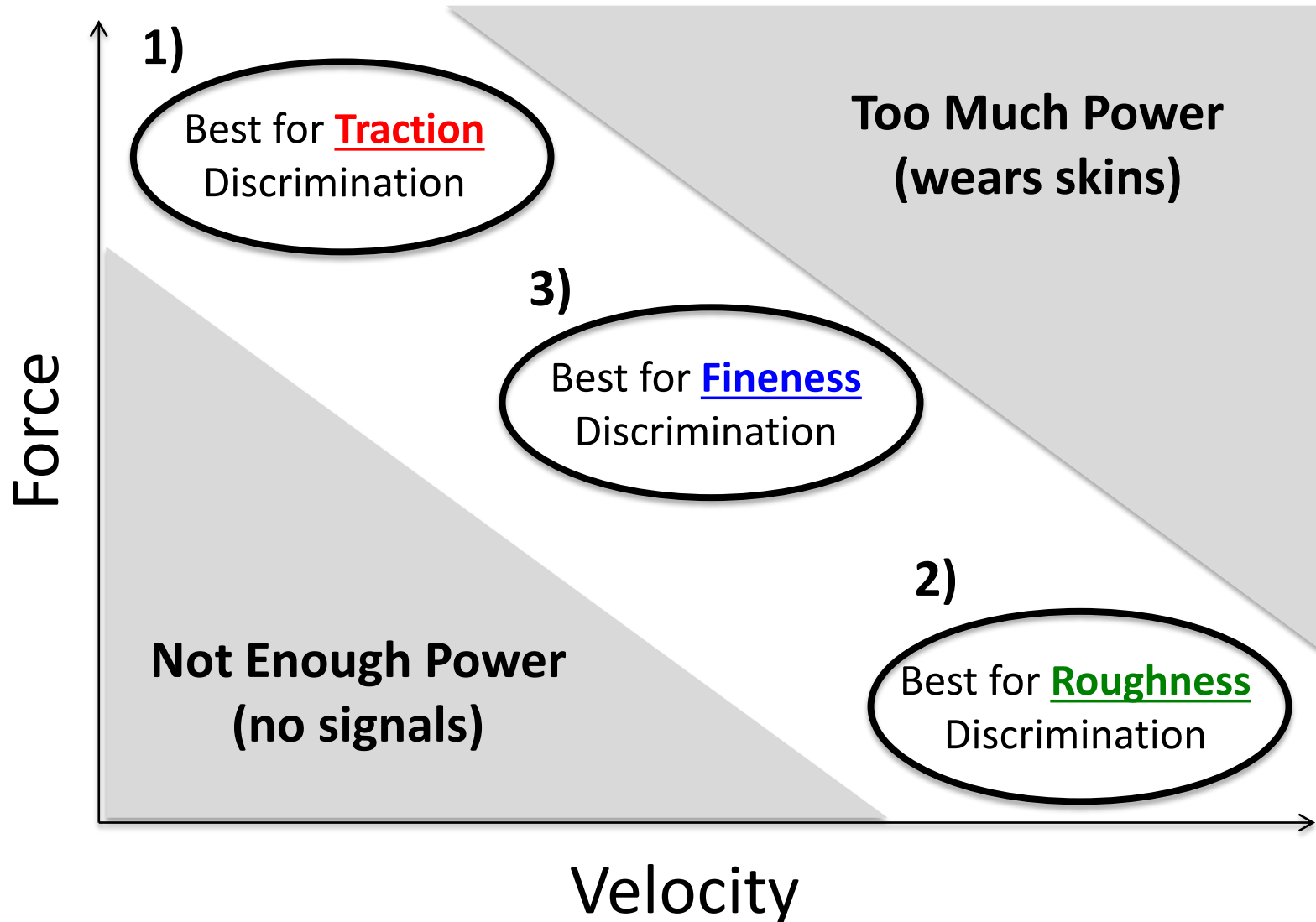


- **Tactile Vibration Sensitivity:**
near human performance
- **Texture Exploratory Movements:**
inspired from human behavior
- **Relevant Texture Properties:**
from language humans use
- **Intelligent Exploratory Strategies**
inspired by theories of biological behavior



Pilot Study – Which Movements are Best?

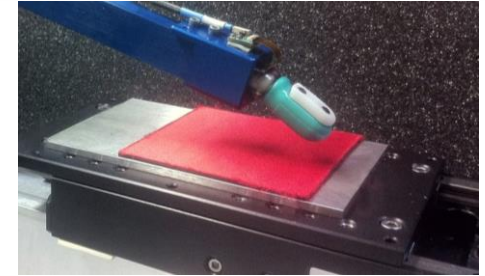
Power \propto Force \times velocity



Texture Properties (from Language)

Inspired from psychophysical literature on texture discrimination

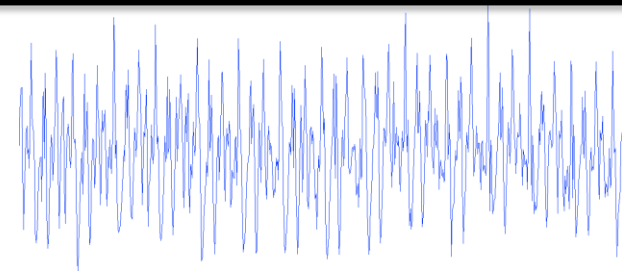
- Traction: *sticky / slippery*
Thrust (from motor)



- Roughness: *rough / smooth*
Vibration Power

Vibration:

Rough:

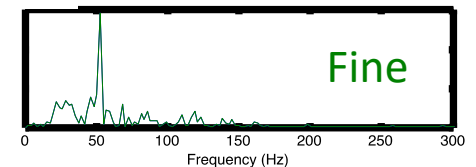
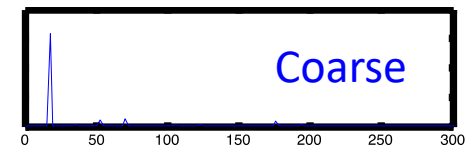


Smooth:



- Fineness: *coarse / fine*
Center Frequency

FFTs:



Bayesian Inference

$$P(A | B) = \frac{P(B | A) P(A)}{P(B)}$$

Bayes' Theorem

Used to update probabilities of textures **after** a movement and observation is made...

How do people decide which movements to make when exploring textures?

Theory: Bayesian Exploration

Unknown Object:



1) Grasp: Figure out shape/size

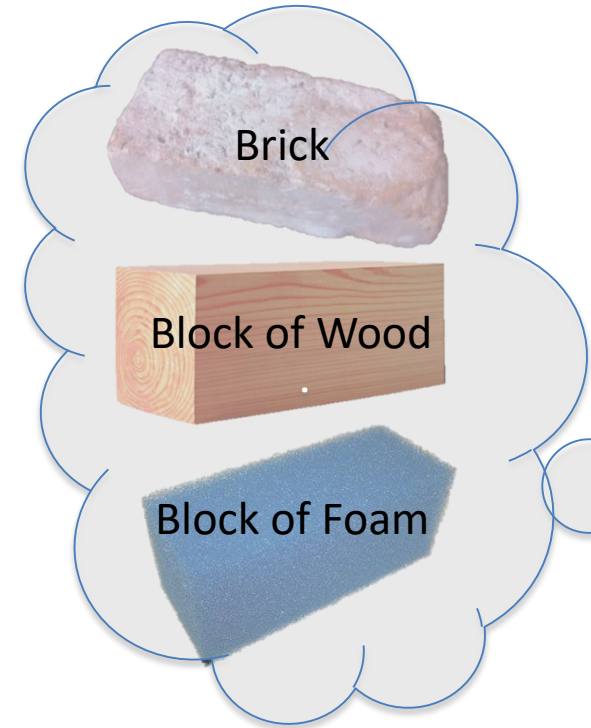


→ Rectangular, Large

2) Pick Up: Is it Heavy?



→ Heavy



It's a Brick!

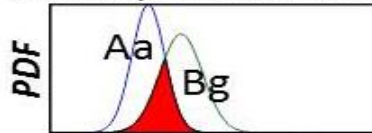
Bayesian Exploration

Database:

Confusion probability matrices between entities for all percepts

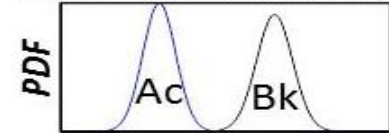
Motor Action 1.

Sensory Dimension I



	A	B	C	D	E
A	1.00	0.69	0.31	0.08	0.00
B	0.69	1.00	0.50	0.88	0.00
C	0.31	0.50	1.00	0.69	0.04
D	0.08	0.88	0.69	1.00	0.00
E	0.00	0.00	0.04	0.00	1.00

Sensory Dimension II

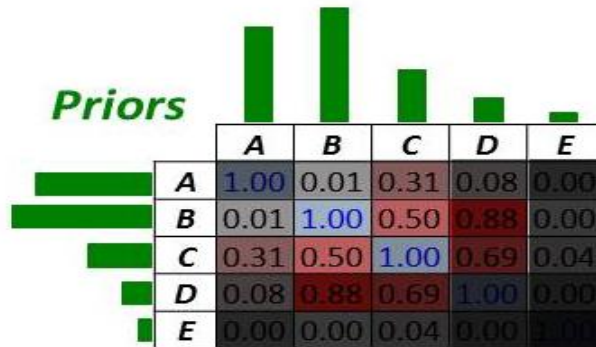


	A	B	C	D	E
A	1.00	0.01	0.85	0.14	0.09
B	0.01	1.00	0.42	0.32	0.60
C	0.85	0.42	1.00	0.13	0.06
D	0.14	0.32	0.13	1.00	0.01
E	0.09	0.60	0.06	0.01	1.00



Weight matrices according to prior probabilities of all entities

Select next percept to obtain according to minimum weighted matrix



	A	B	C	D	E
A					
B					
C					
D					
E					
A	1.00	0.02	0.12	0.08	0.34
B	0.02	1.00	0.50	0.88	0.00
C	0.12	0.50	1.00	0.69	0.08
D	0.08	0.88	0.69	1.00	0.22
E	0.34	0.00	0.08	0.22	1.00



Compute posterior probabilities

Perform exploratory movement and measure percept of unknown



117 Textures!

*5 Trials Each
Movement*

Glasses

Foams

Rubbers

Leathers

Cloths

Weaves

Papers

Furs

Art Supplies

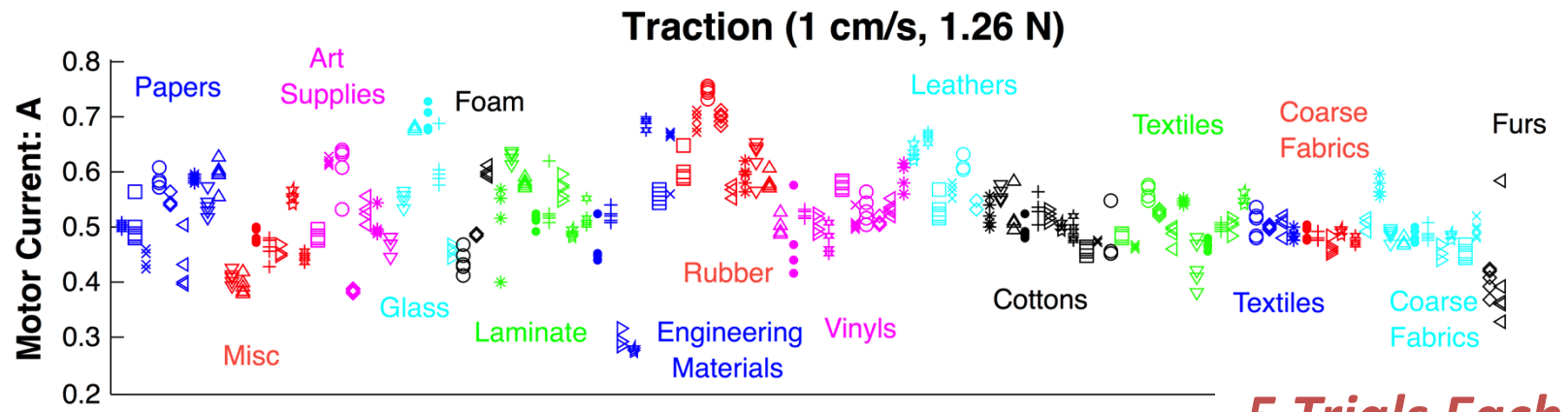
Woods

Metal Finishes

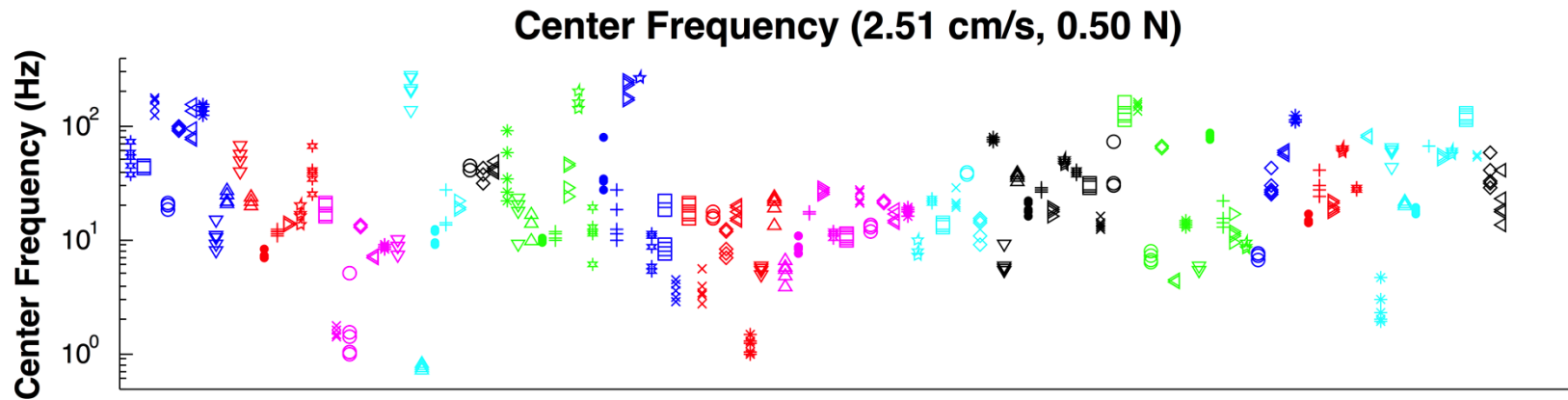
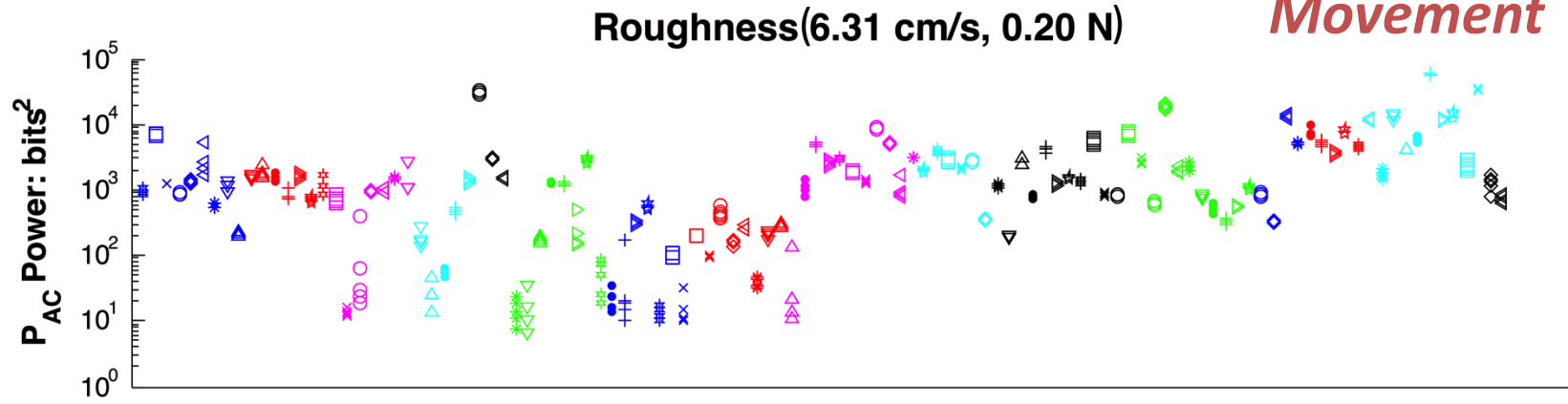
Plastics

Vinyls

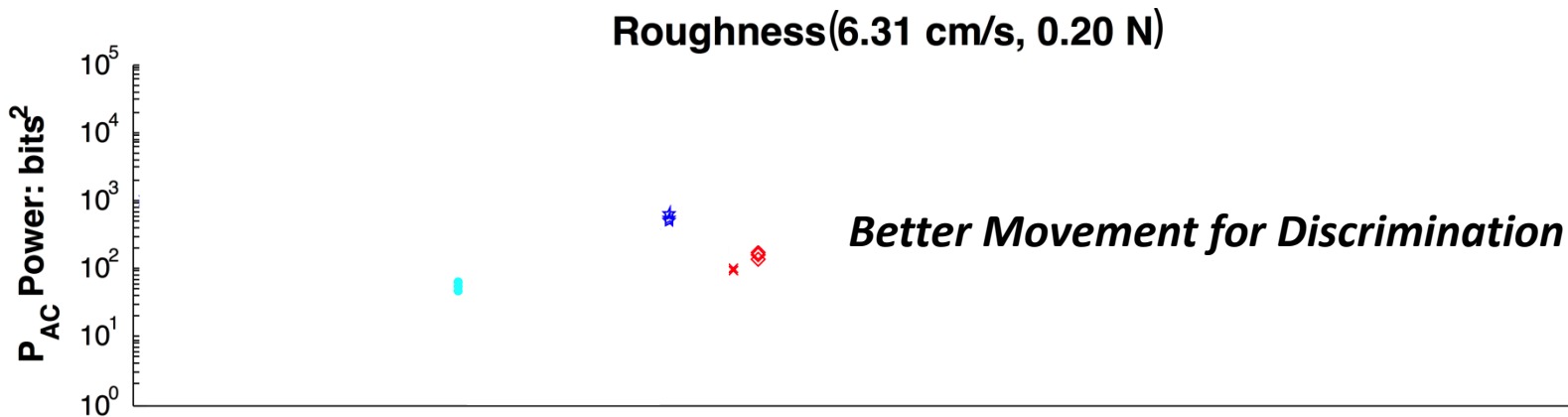
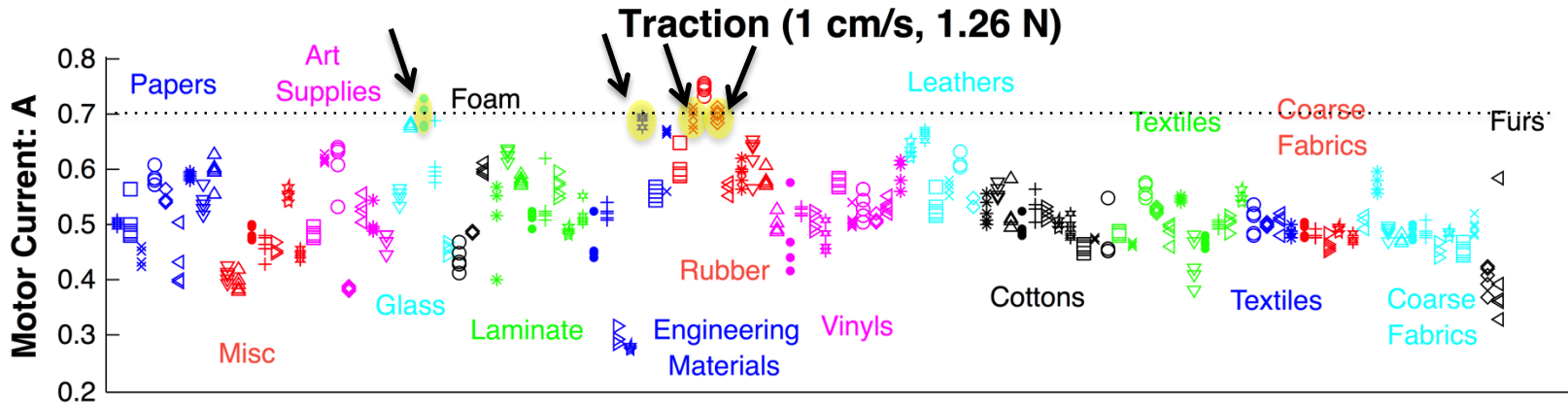




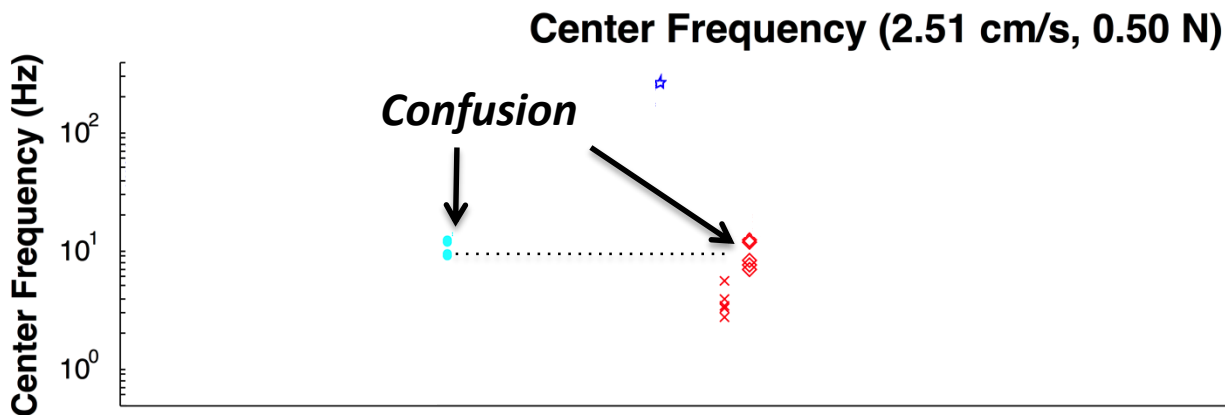
*5 Trials Each
Movement*

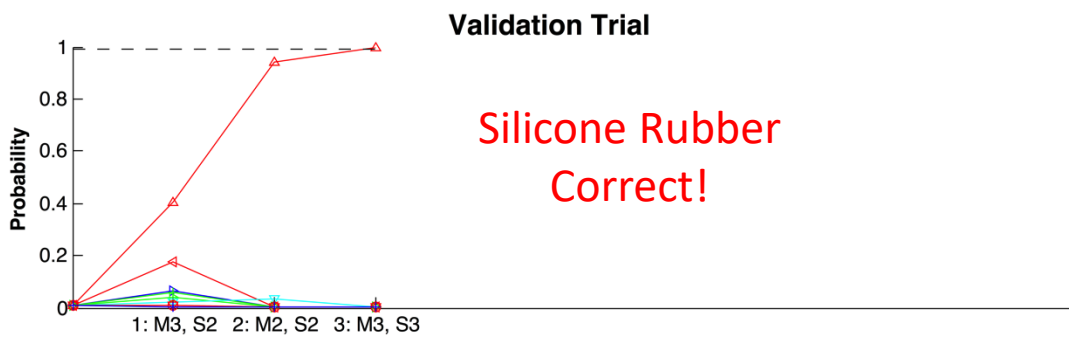


**1st
Movement**

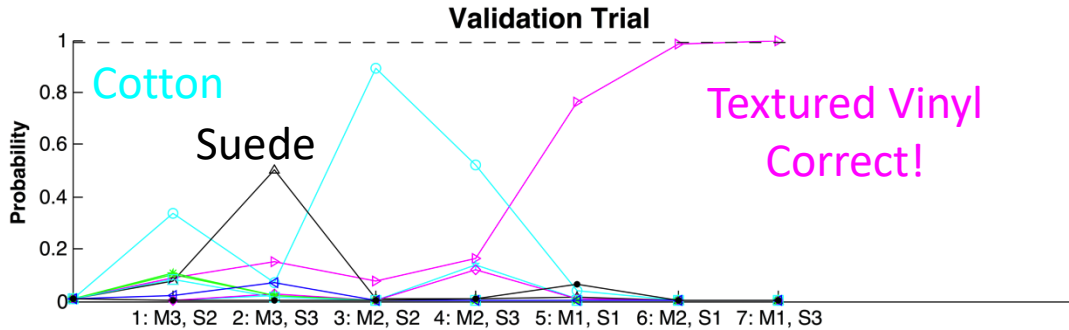


Possible
Future
Movements

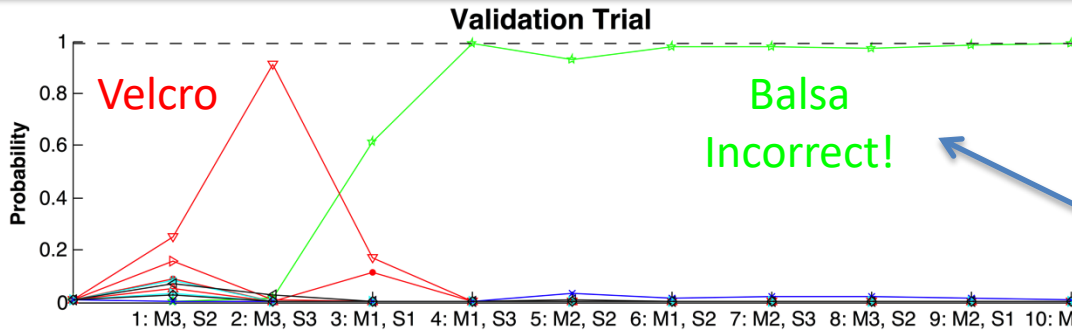




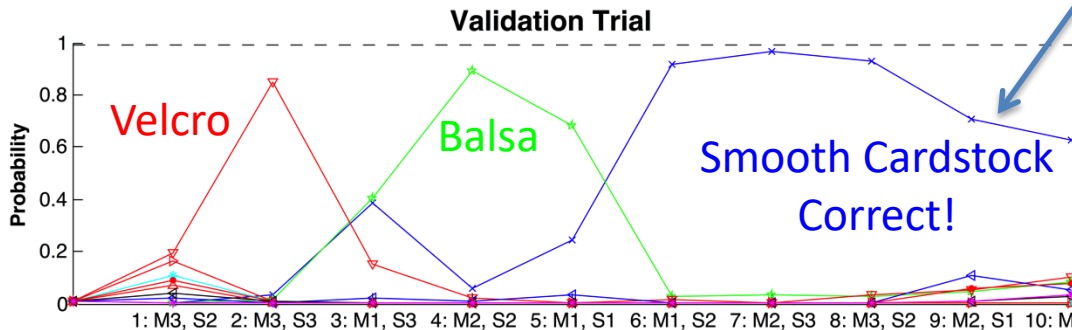
Sometimes rapid identification



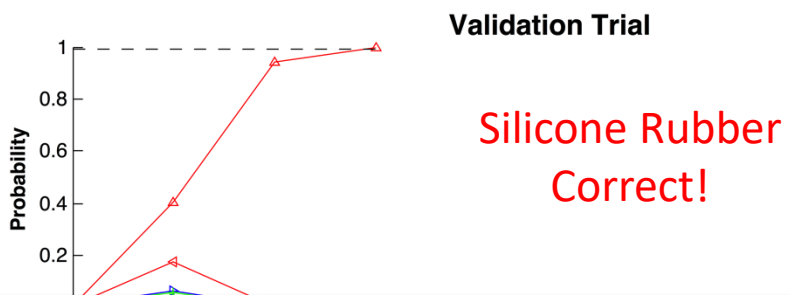
Sometimes tests a few hypotheses
before a correct identification



Sometimes difficulty distinguishing
two materials that humans
cannot distinguish either



1)



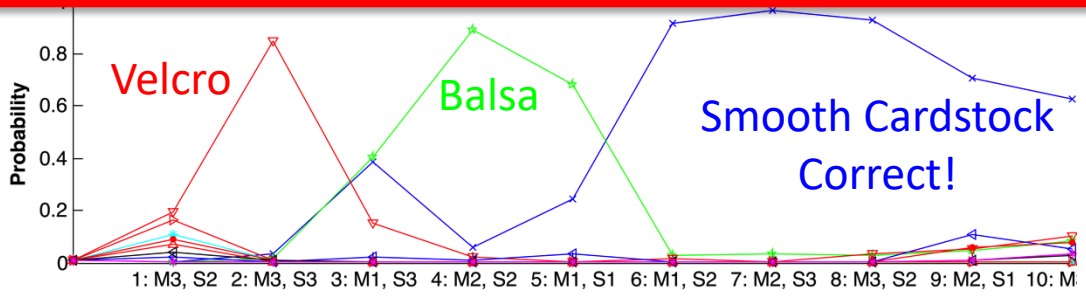
Sometimes, Quick Identification

16 Validation Textures

Average: 95.4% Correct Classification

Median Movements to Converge: 5

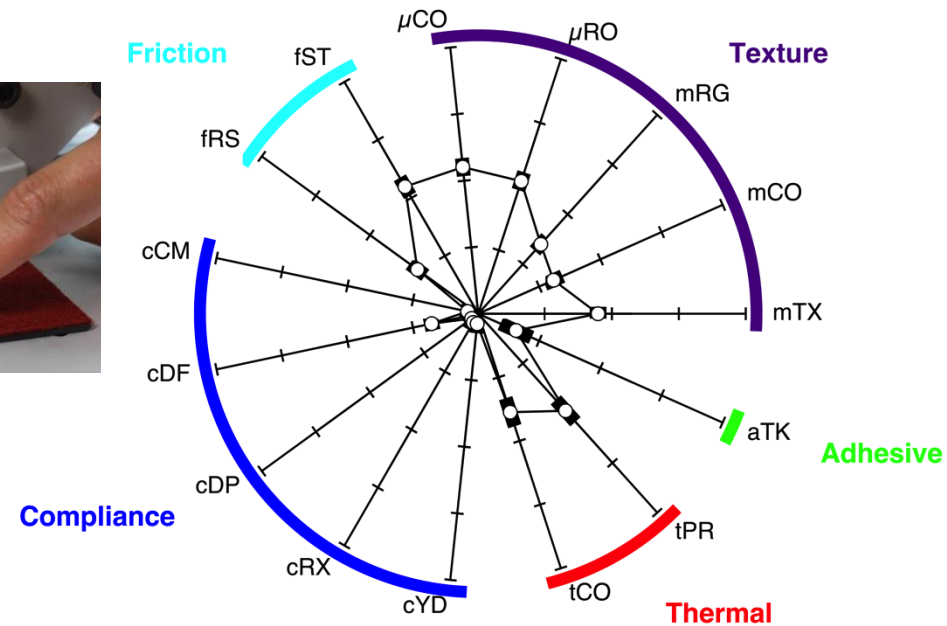
4)



two: Smooth Cardstock and Balsa Wood

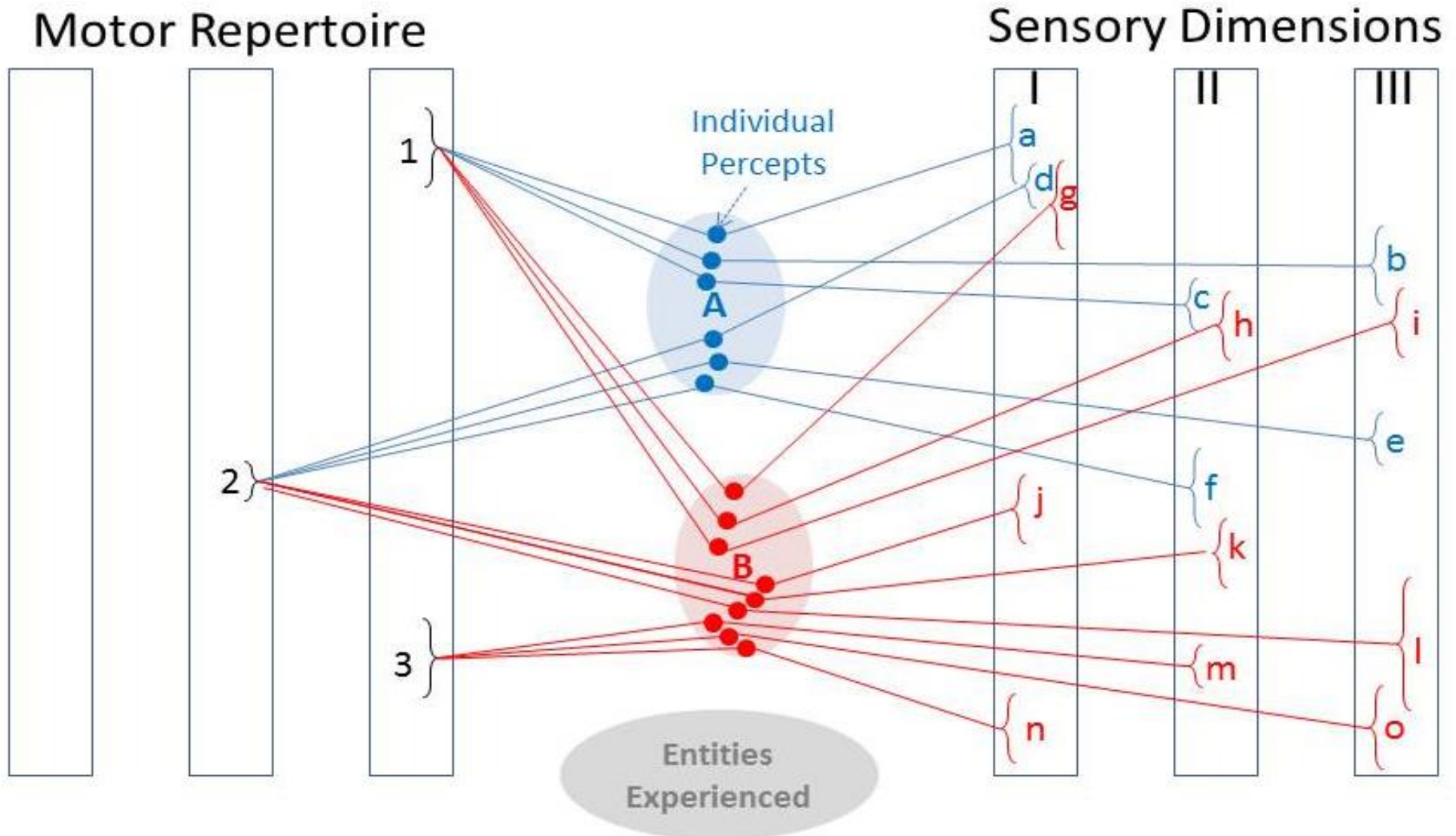
Quantifying Touch

Measures 15 properties related to:
Texture, Friction, Compliance,
Thermal Properties and Adhesion



**If you can feel the difference,
we can quantify it!**

Representing the World in the Brain



Bayesian Action&Perception: Representing the World in the Brain

Recently expanded to 500 materials explored by 5 movements to create 15 perceptual dimensions, resulting in MORE ACCURATE and FASTER performance. Avoids “curse of dimensionality”

