

# A Haptic Exploration and Surface Classification of Objects with Four Typical Surface Properties

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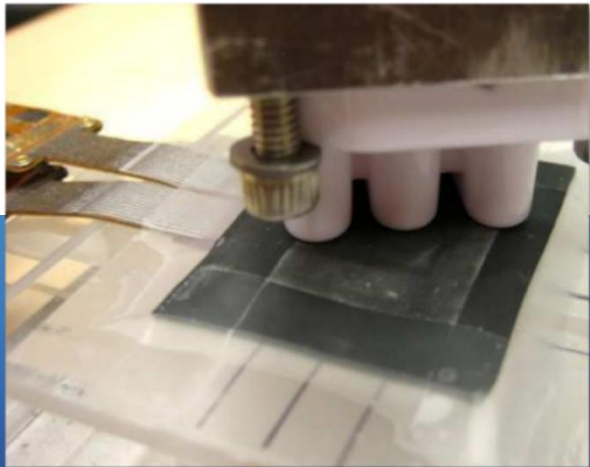
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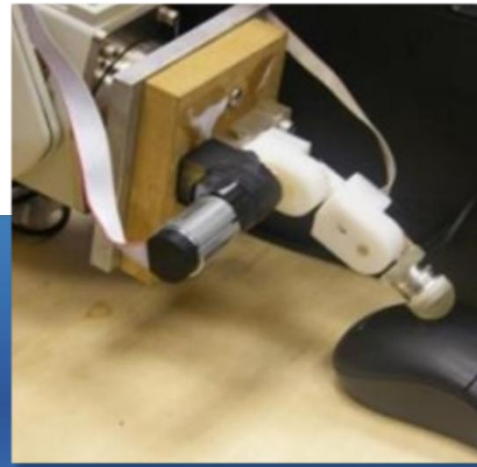
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# Background: **Surface Exploration** Surface features

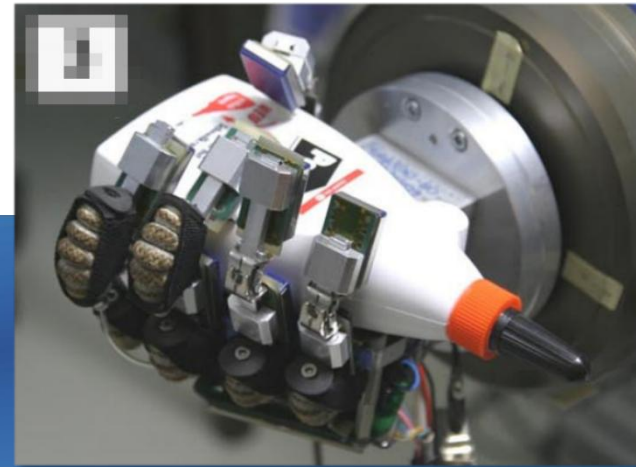
Factors for identifying the specific properties of object:  
local contact geometry and the sensation of touching.



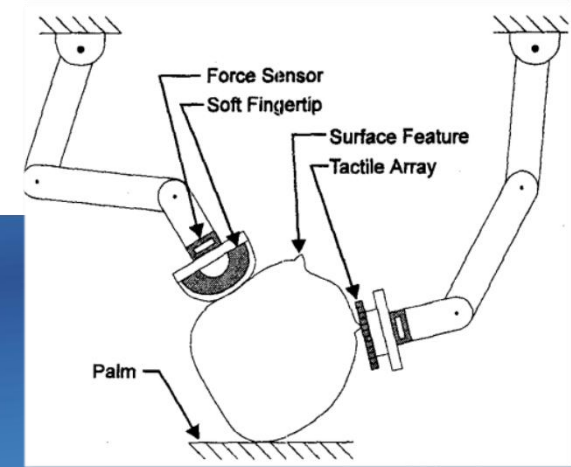
Tactile Sensor



Tactile Robots



Tactile Robotic  
Grasping

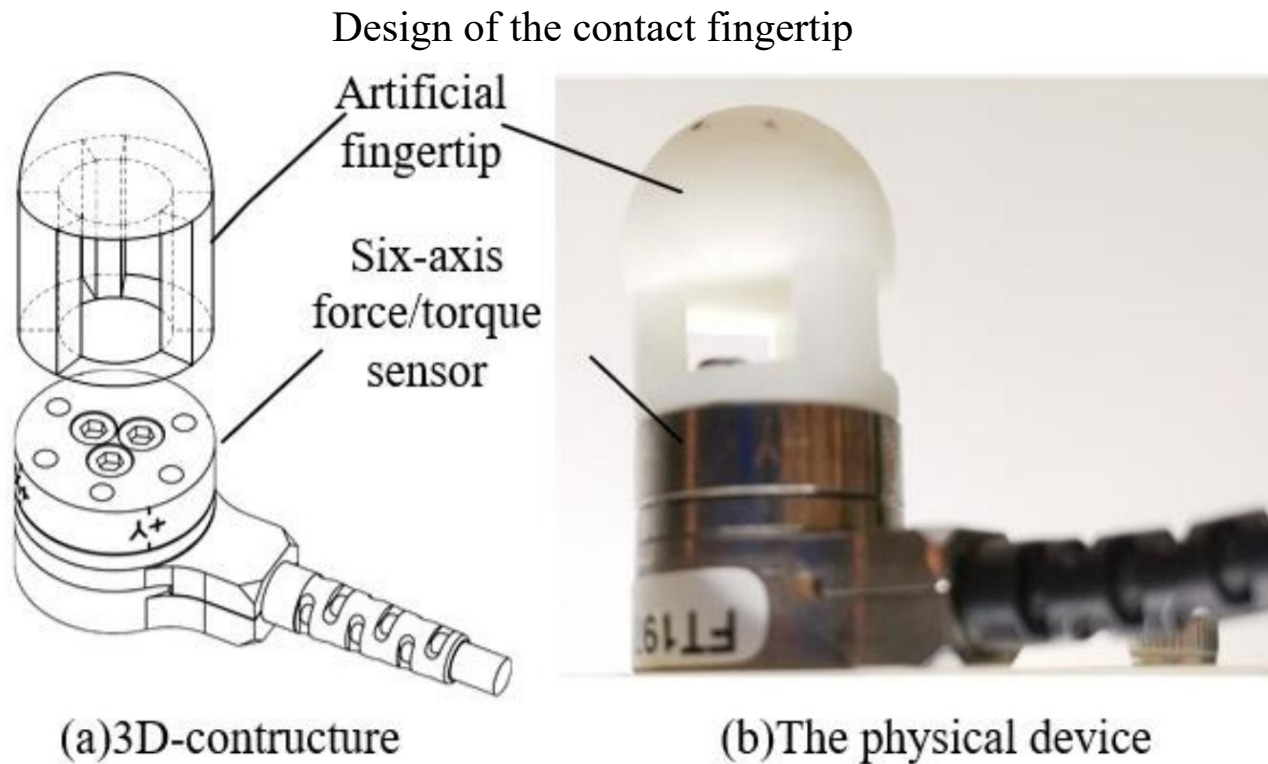


Surface Exploration  
in Robotics

# System Setup

## I . The Design of the Fingertip

## II . The Tactile Information Dataset



### Structure of Contact fingertip

- 6-axis transducer on the fingertip. (ATI Nano17 force/torque sensor)
- Hemispherical hat.

### Hollow out extension structure

- Increasing the length of the contact fingertip.
- Expanding the detection range.

**Dedicated robotic fingertip equipped with a mini force sensor**

# System Setup

I . The Design of the Fingertip

II . The Tactile Information Dataset

## Establishment of the Dataset

- Collected by our tactile sensing fingertip.
- 2000 data records obtained by touching the four objects.
- 1000 records for training, 1000 for testing.

Labels of Four Objects

Type of object	Labels
Tissue packaging	Soft-smooth
Sponge cushion	Soft-rough
Acrylic board	Hard-smooth
Wooden board	Hard-rough

Example images of the four object types in our Tactile Information Dataset



(a)Acrylic board



(b)Tissue packaging



(c)Wooden board



(d)Sponge cushion

# Surface-following Algorithm

## Acquisition and Processing of Tactile Information

### Contact Equilibrium System Equation

- Computing the contact location according to the force/torque measured.

The contact equilibrium system equation:

$$q^T = (x, y, z, p)^T$$

$$g^T(q) = (g_1(q), g_2(q), g_3(q), g_4(q))^T$$

$$g^T(q) = \begin{cases} p\nabla U_x - f_y z + f_z y - m_x \\ p\nabla U_y - f_z x + f_x z - m_y \\ p\nabla U_z - f_x y + f_y x - m_z \\ U(x, y, z) \end{cases}$$

Fingertip marker with three groups of dots:



### Contact Sensing Information Estimating

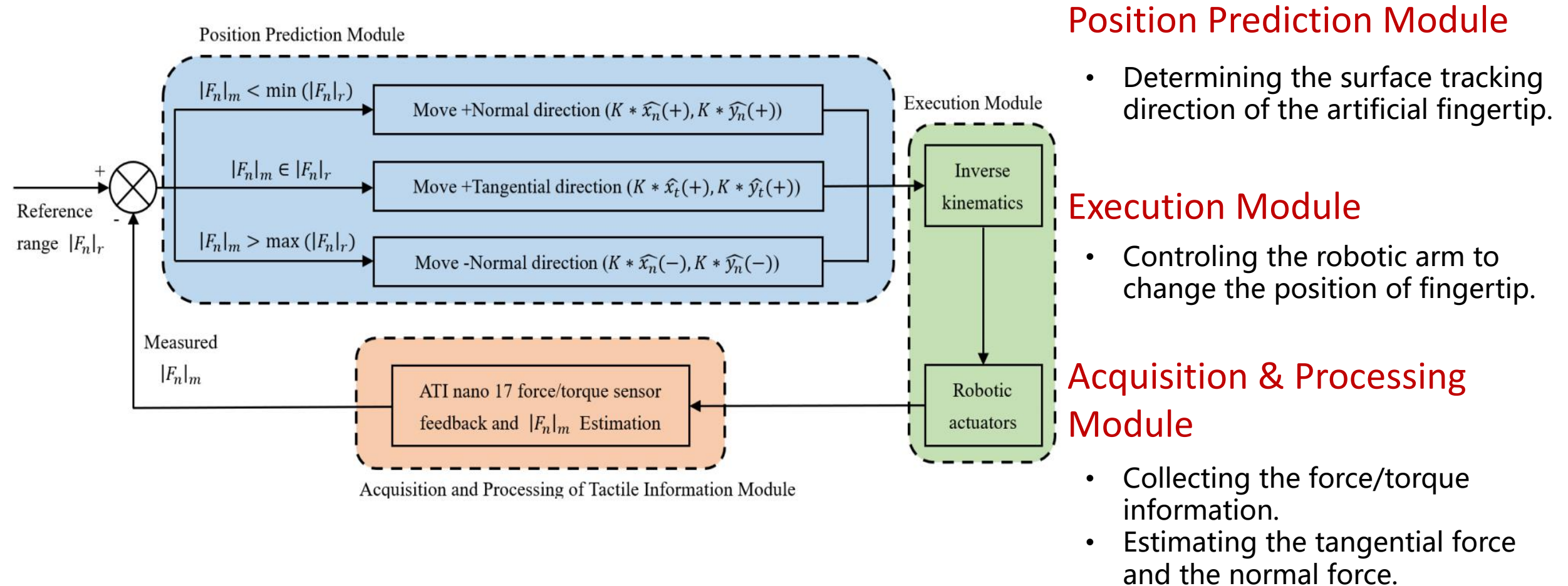
- Levenberg-Marquardt Algorithm (LMA).
- Mean error: **0.25mm**.

### Accuracy validation of the LMA

Groups	Distance from Caliper	Distance from Sensor	Error
1	9.87mm	9.72mm	0.15mm
2	14.79mm	14.98mm	-0.19mm
3	14.13mm	14.53mm	-0.40mm

# Surface-following Algorithm

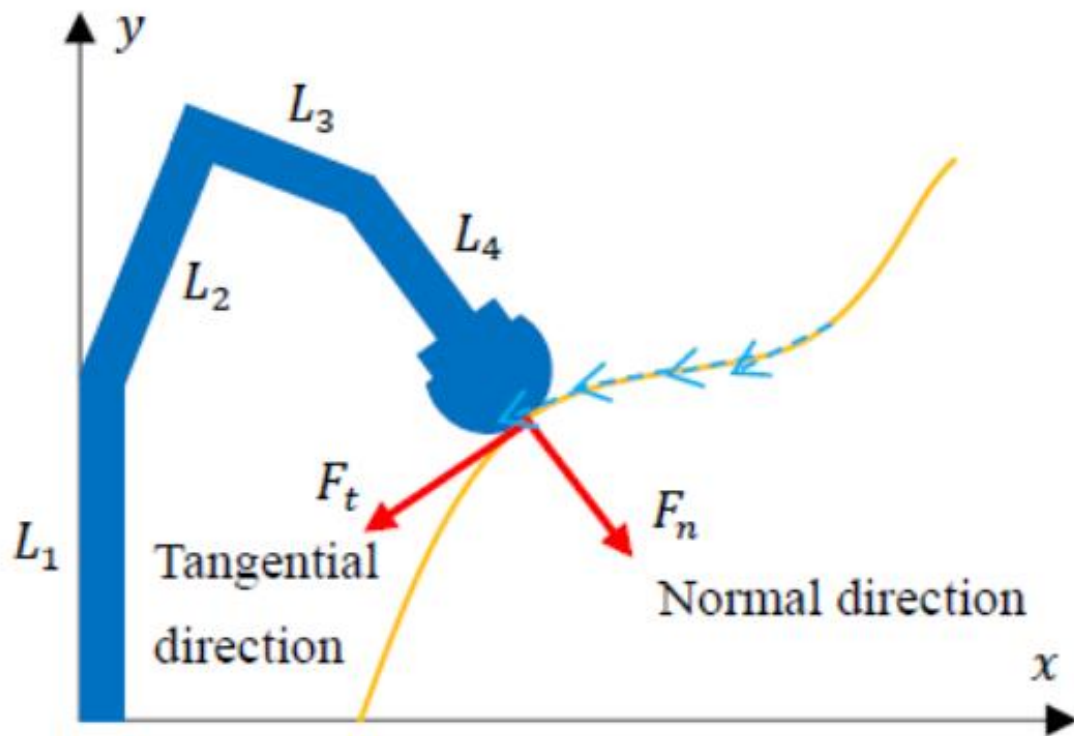
## II. Efficient Surface-Following Algorithm



# Surface-following Algorithm

## II. Efficient Surface-Following Algorithm

Predictive surface contour tracking of an unknown object:



$$\left\{ \begin{array}{l} \text{if } |F_n| < \min(|F_r|), \text{ then move + direction } F_n \\ \text{if } |F_n| \in \text{range}(|F_r|), \text{ then move + direction } F_t \\ \text{if } |F_n| > \max(|F_r|), \text{ then move - direction } F_n \end{array} \right.$$

$$x_{n+1} = x_n + K * \hat{x}_t$$

$$y_{n+1} = y_n + K * \hat{y}_t$$

$$\hat{x}_t = \frac{F_{tx}}{\|F_t\|} \quad \hat{y}_t = \frac{F_{ty}}{\|F_t\|}$$

# Experiments

## I . Surface Haptic Exploration of Several Objects

- II . The Friction Coefficient of the Object's Surface
- III. Tactile Recognition Algorithm Based on a Feedforward Neural Network

The procedure of the contour following on an orange using the contact sensing fingertip based on the proposed control algorithm



(a)



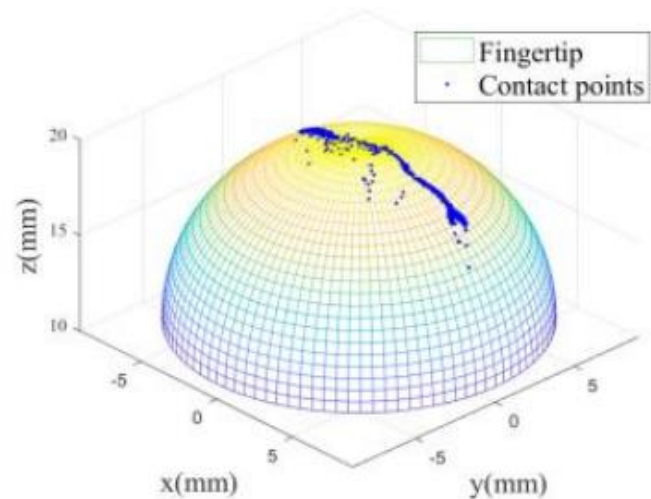
(b)



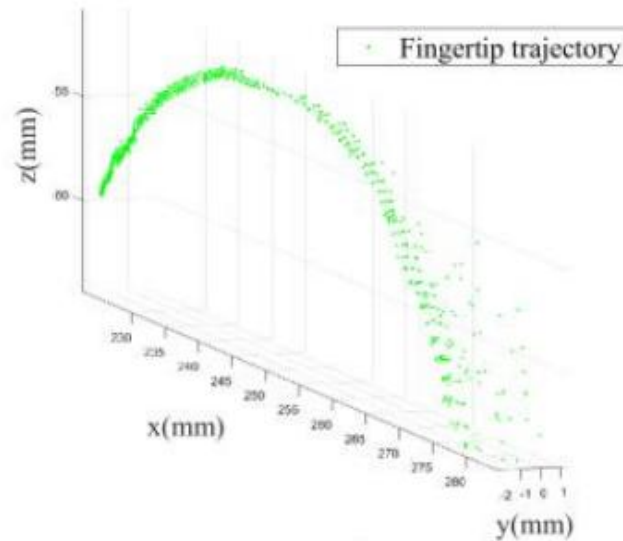
(c)



(d)



(e)



(f)



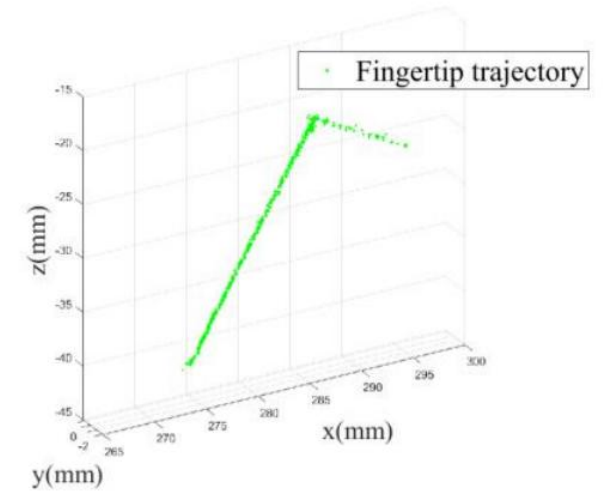
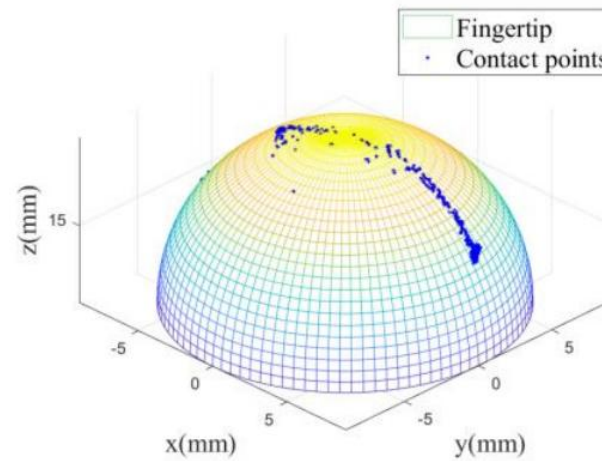
# Experiments

## I . Surface Haptic Exploration of Several Objects

II . The Friction Coefficient of the Object's Surface

III. Tactile Recognition Algorithm Based on a Feedforward Neural Network

Exploring the feasibility of the surface-following algorithm on surface with discontinuous curvatures.



# Experiments

I . Surface Haptic Exploration of Several Objects

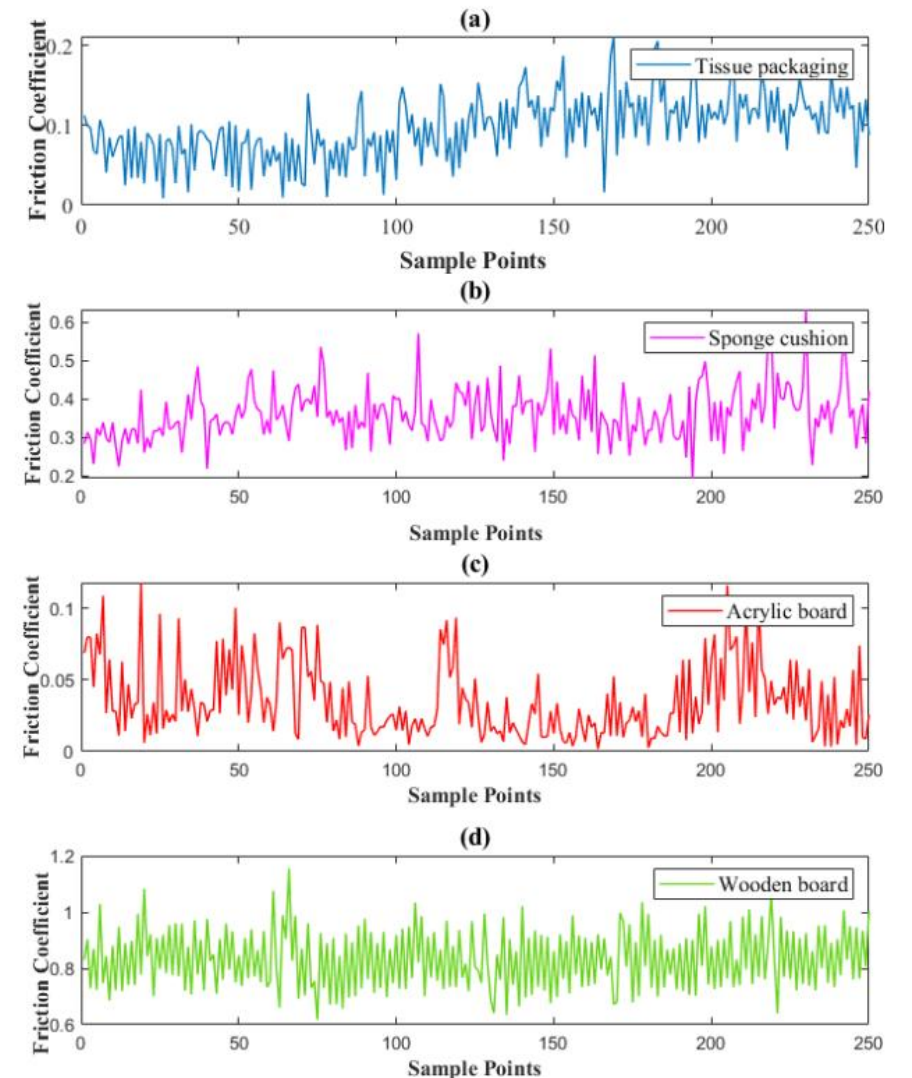
## II. The Friction Coefficient of the Object's Surface

III. Tactile Recognition Algorithm Based on a Feedforward Neural Network

The friction coefficient  $f$  can be computed as: 
$$f = \left| \frac{F_t}{F_n} \right|$$

Type of object	Average friction coefficient
Tissue packaging	0.097
Sponge cushion	0.361
Acrylic board	0.035
Wooden board	0.833

The friction coefficient of the detected objects



(a)Acrylic board



(b)Tissue packaging



(c)Wooden board



(d)Sponge cushion

# Experiments

- I . Surface Haptic Exploration of Several Objects
- II . The Friction Coefficient of the Object's Surface
- III. **Tactile Recognition Algorithm Based on a Feedforward Neural Network**

The classification boundary is obtained by neural network. Most of the objects are correctly divided. Some outliers exist due to the measurement error.

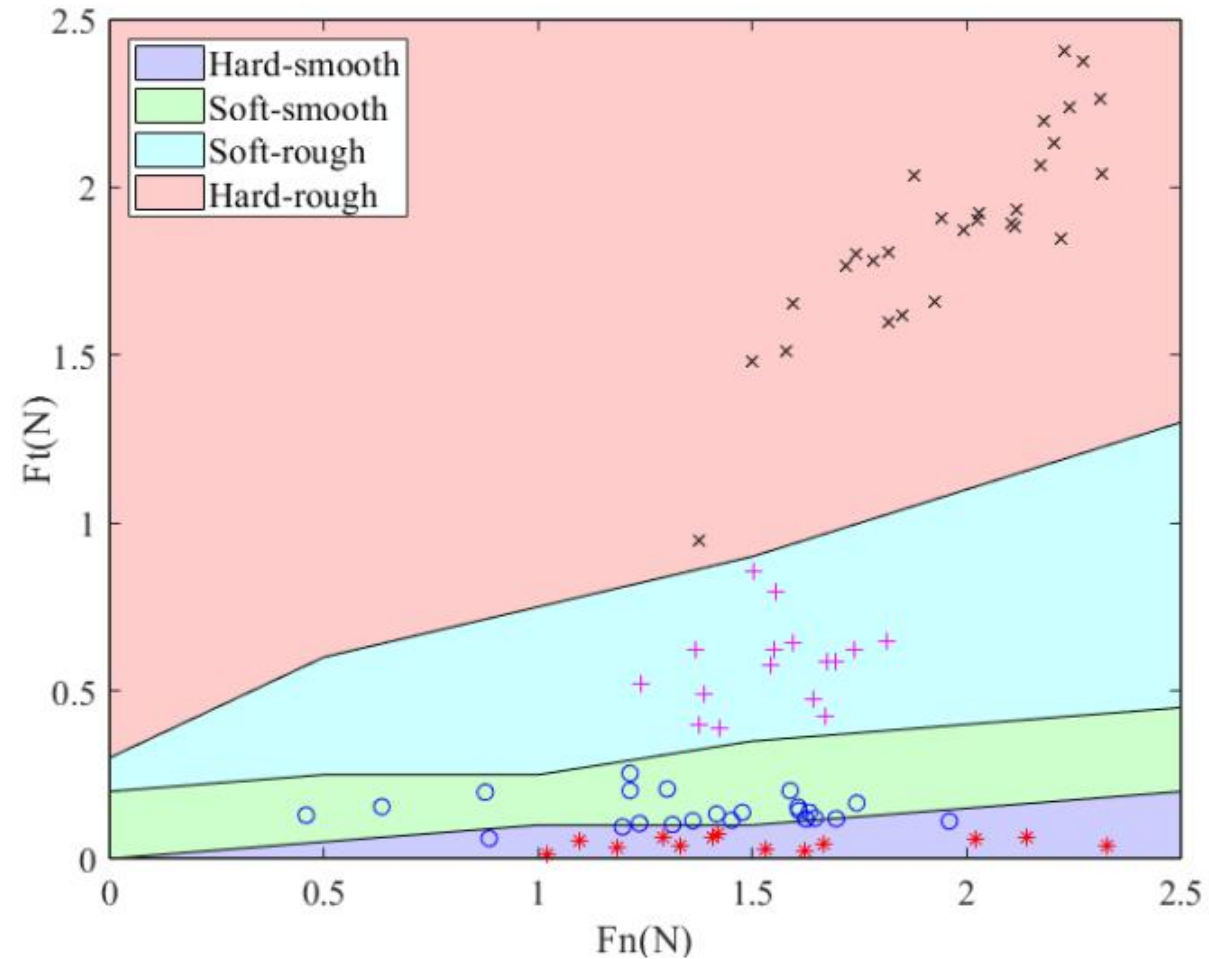
**Input:**  
Tangential Force and Normal Force

**10 neurons Sigmoid Function**

**Output:**  
Probabilities for the four adjectives

Type of object	Accuracy	Average accuracy
Soft-smooth	86.0%	90.2%
Soft-rough	92.2%	
Hard-smooth	90.0%	
Hard-rough	96.3%	

The classification test result of the trained model



# Discussion and Future Work

## I. Conclusion

- Design of an artificial fingertip.
- Experimental validation of the artificial fingertip.

## II. Future Work

- Utilizing more detailed features.
- Enhancing the efficiency of surface tracking algorithms

# Thanks !

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