

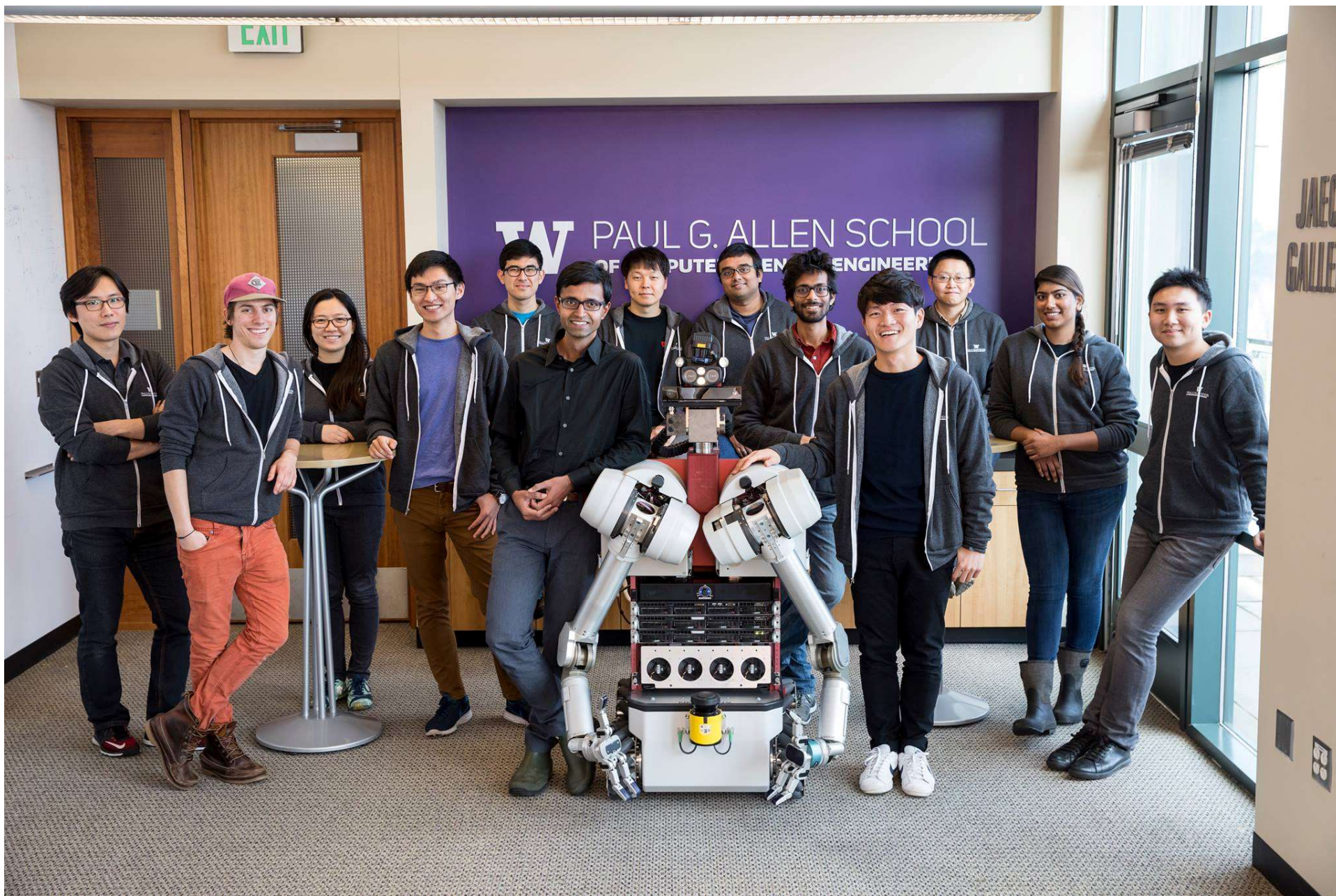
# Robot-world physical interactions: Challenges, Solutions, and Research directions

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Research Associate

*Personal Robotics Lab*  
*Computer Science and Engineering*  
**University of Washington**



Many slides courtesy of Siddhartha S. Srinivasa



# Manipulation



# Easy?



# What's easy? What's hard?



**Hard!**



# The Sense-Plan-Act Paradigm under Uncertainty

# HERB: Home Exploring Robot Butler

A Mobile Manipulation Testbed Built by PRL

Personal Robotics Lab   
Carnegie Mellon University



# Physical Manipulation



# Geometric Search



# Physics-Based Manipulation

Manipulation under Uncertainty



# Physics-Based Manipulation

Manipulation under Uncertainty

Nonprehensile Whole Arm  
Rearrangement Planning  
on Physics Manifolds

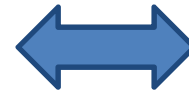
Jennifer King, Joshua Haustein,  
Siddhartha Srinivasa, Tamim Asfour

Carnegie Mellon University  
Karlsruhe Institute of Technology

# Manipulation with and around people



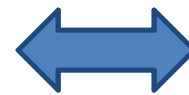
# Physical Manipulation



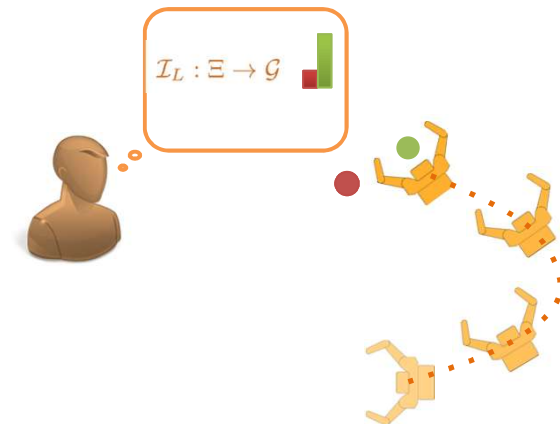
# Geometric Search

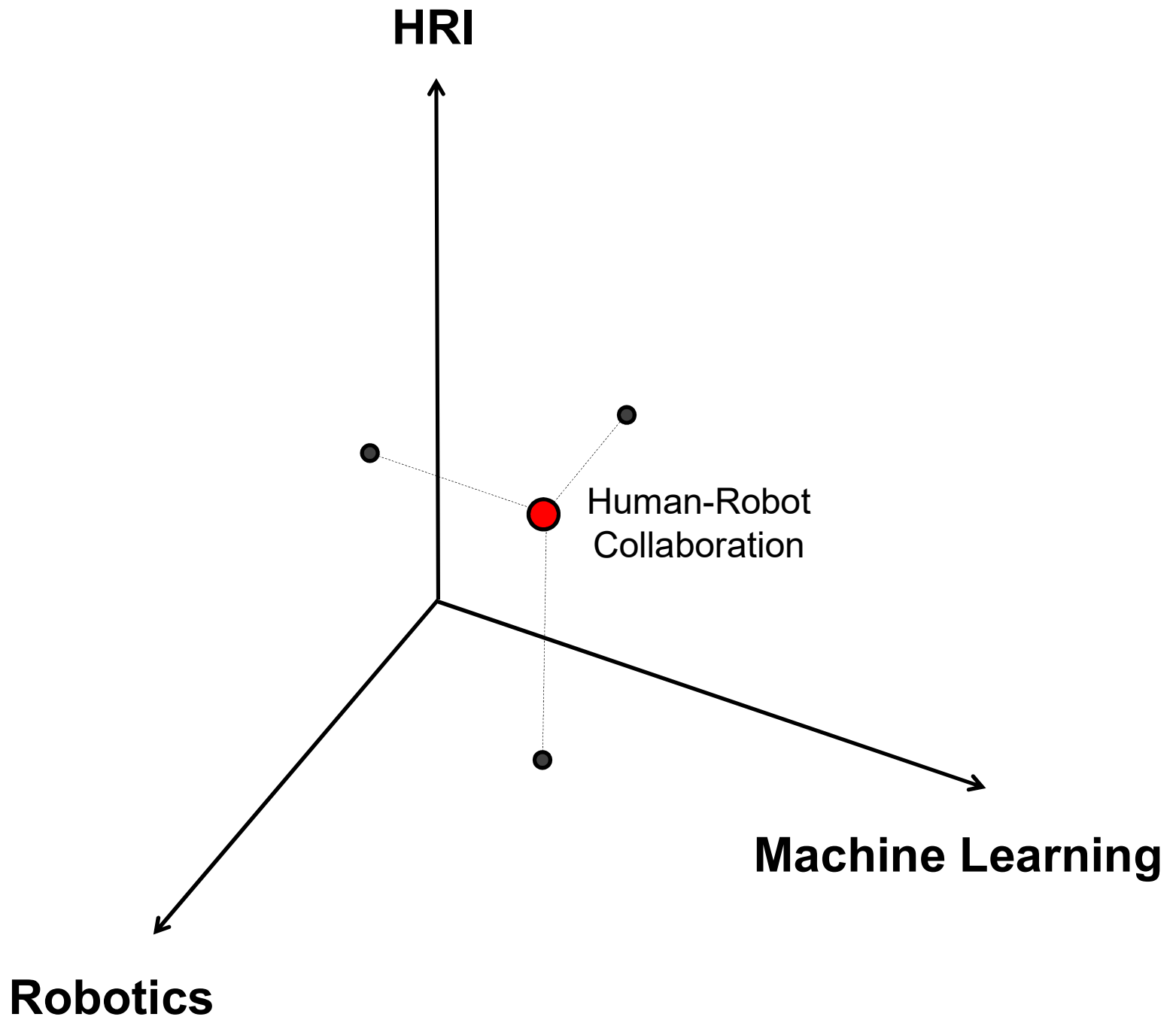


# Human-Robot Collaboration



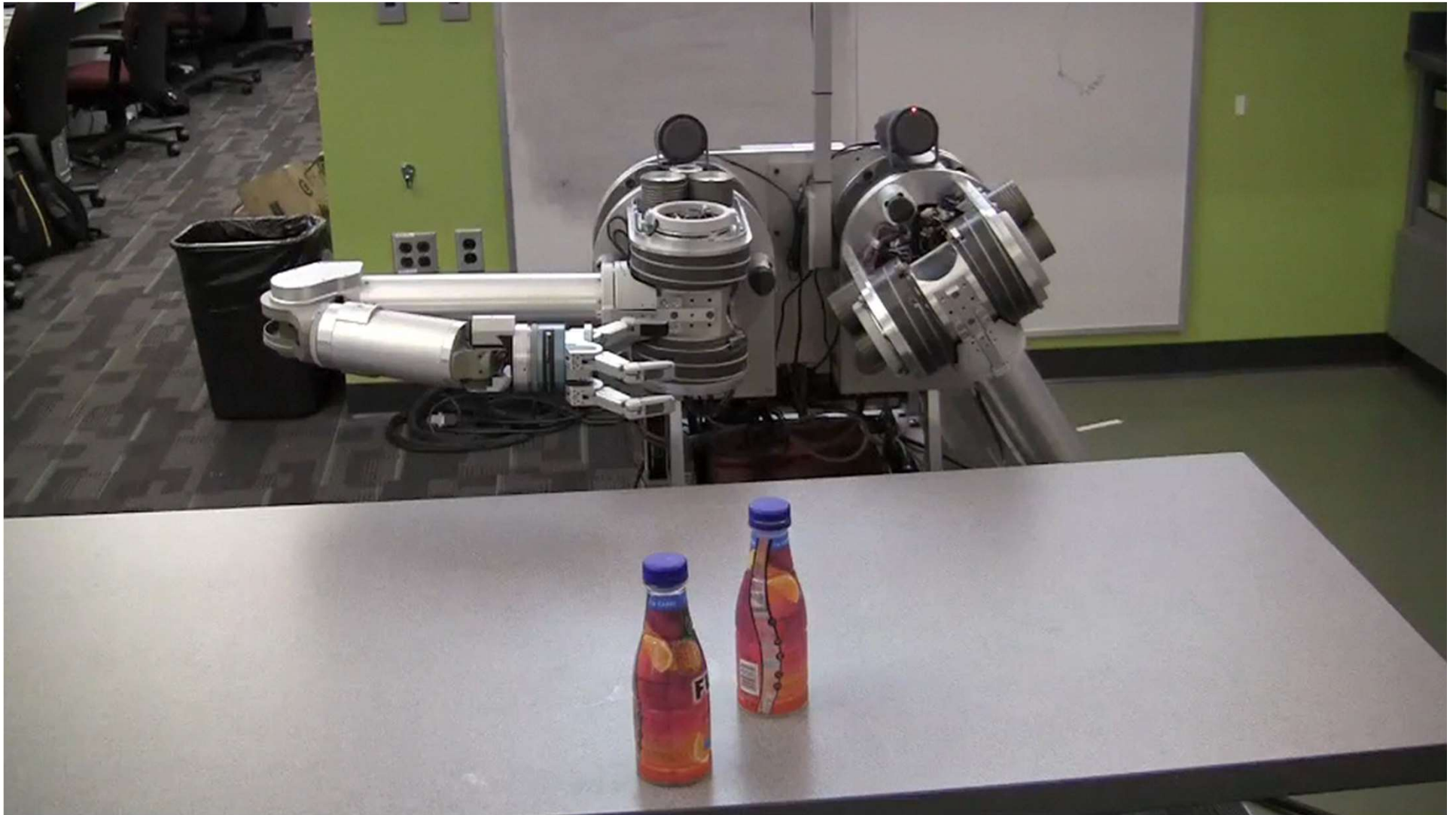
# Optimal Control





# Legible Robot Motion

Mathematical Models for Human Robot Interaction



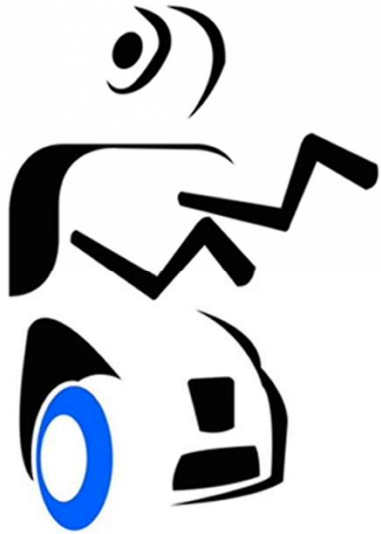
# Deceptive Robot Motion

Mathematical Models for Human Robot Interaction



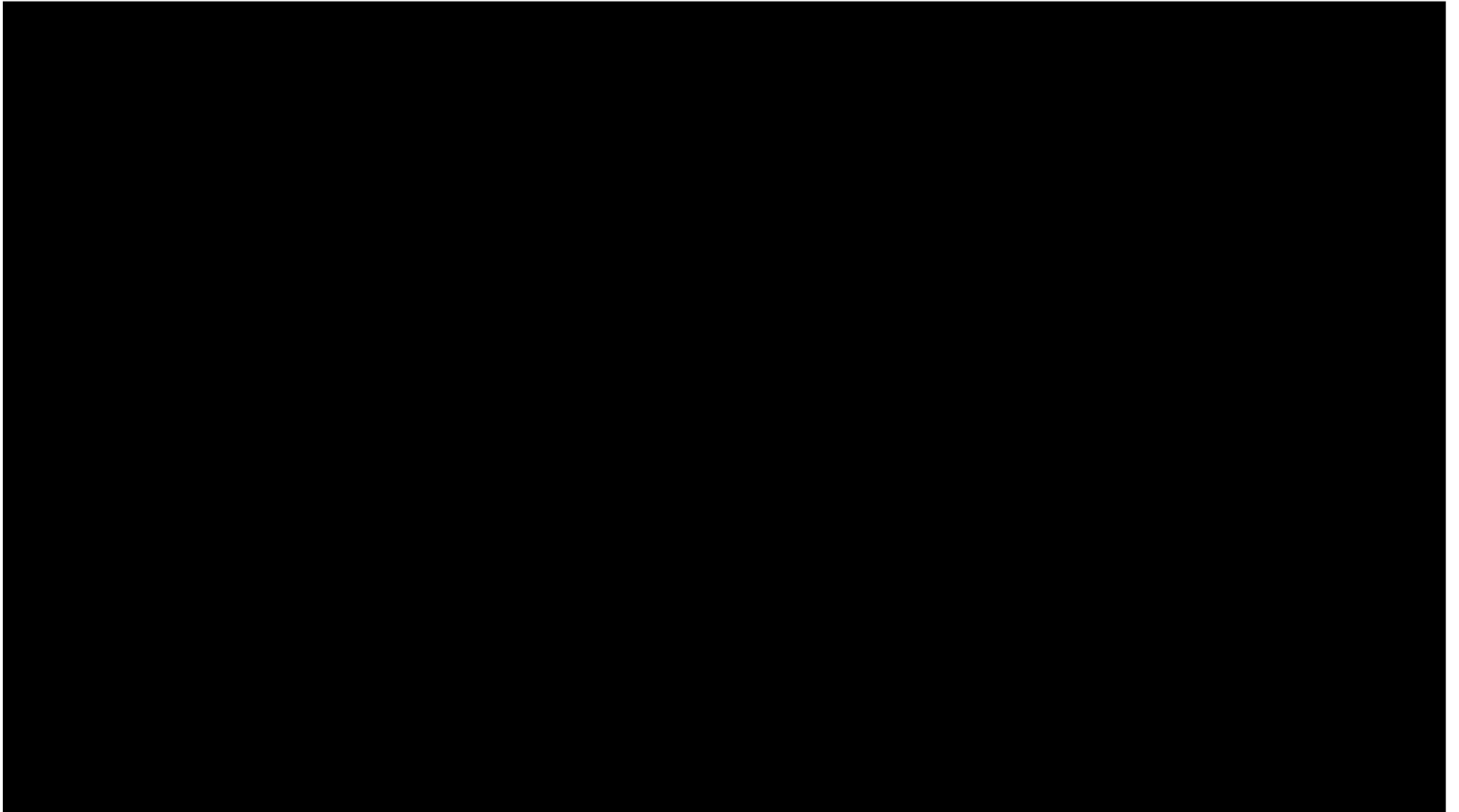


# Assistive Feeding

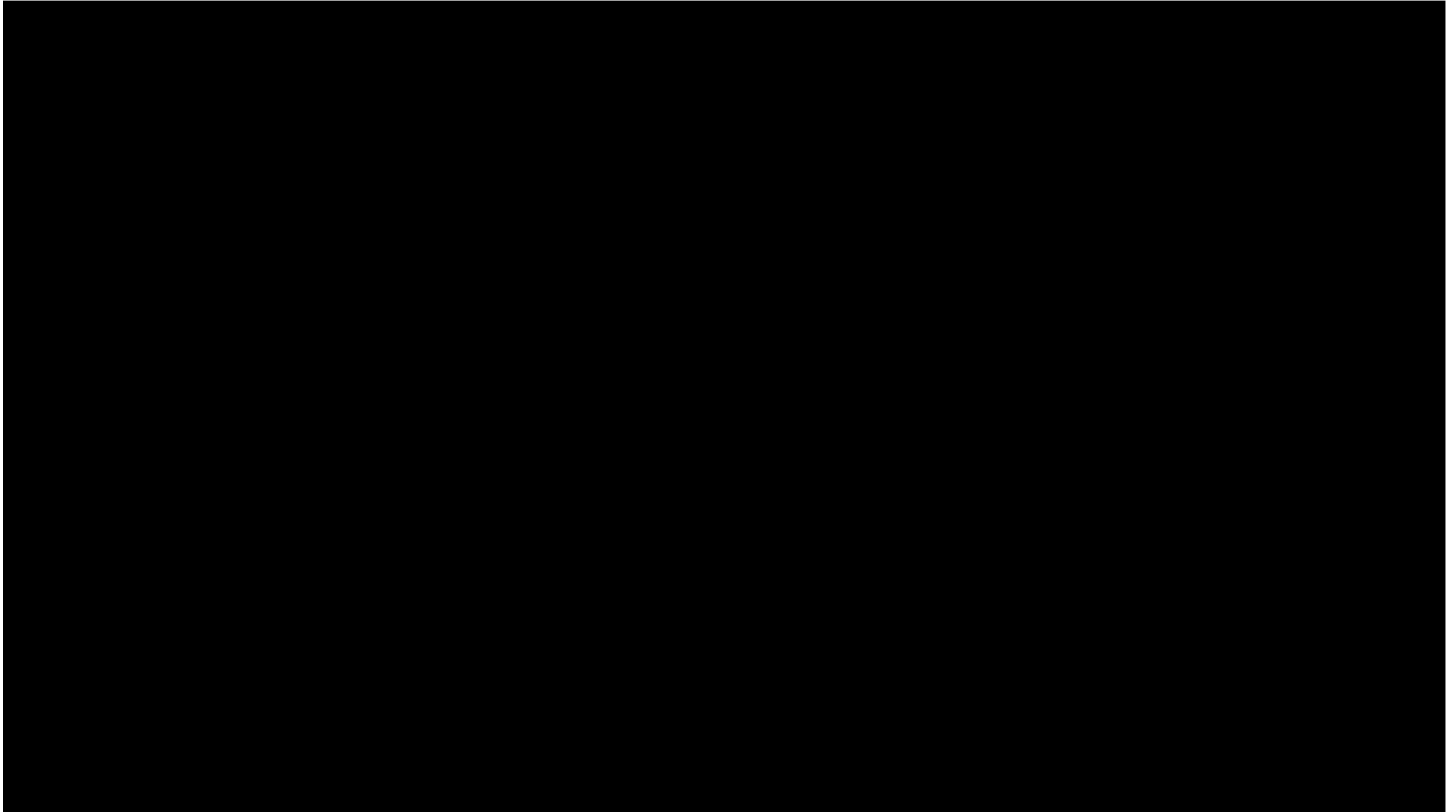


Autonomous Robot Feeding  
with Assistive Dexterous Arm  
(ADA)

# Food Manipulation: Deformable objects



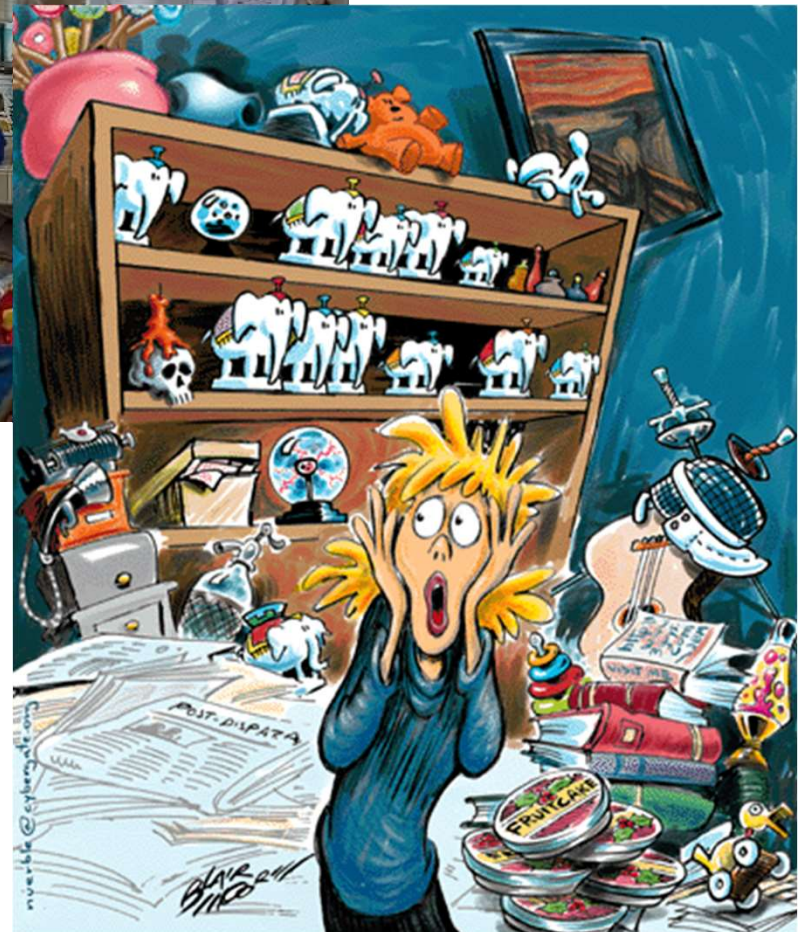
# Food Manipulation: Deformable objects



**Hard!**



# Hard!



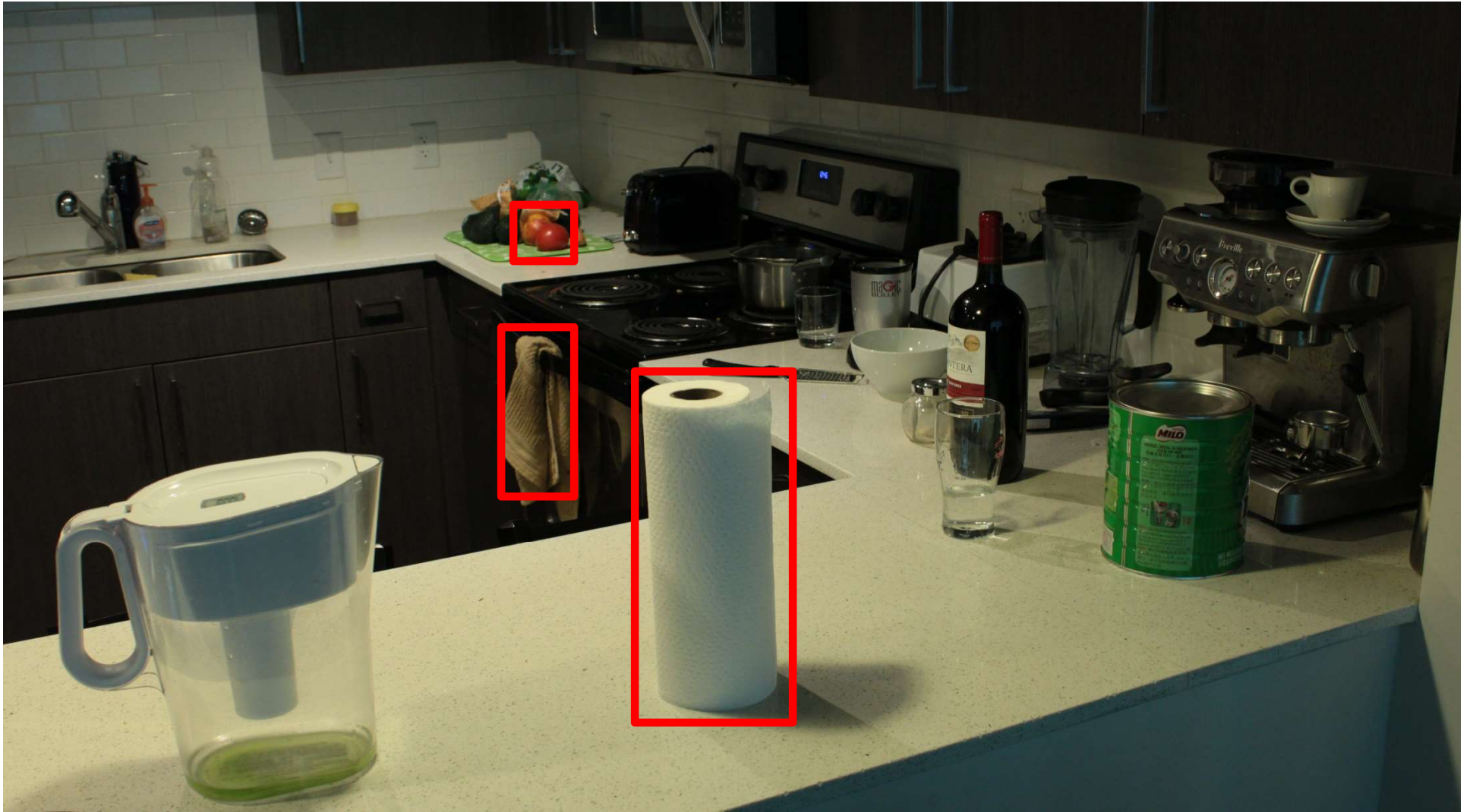
Clutter: Contact is inevitable!  
What properties are relevant?

# Let's take an example environment...



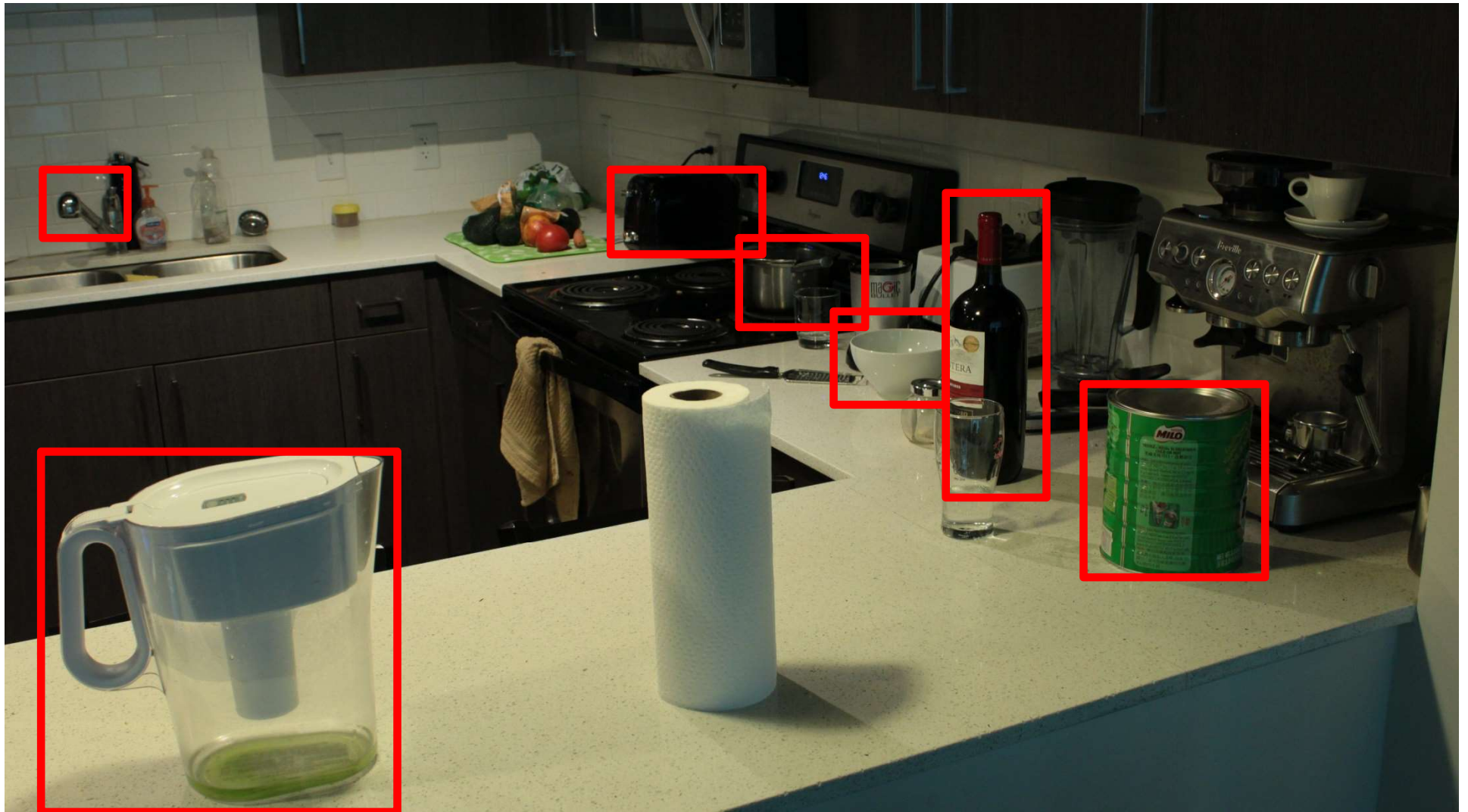
**A Kitchen**

# Let's take an example environment...



We have some soft objects ..

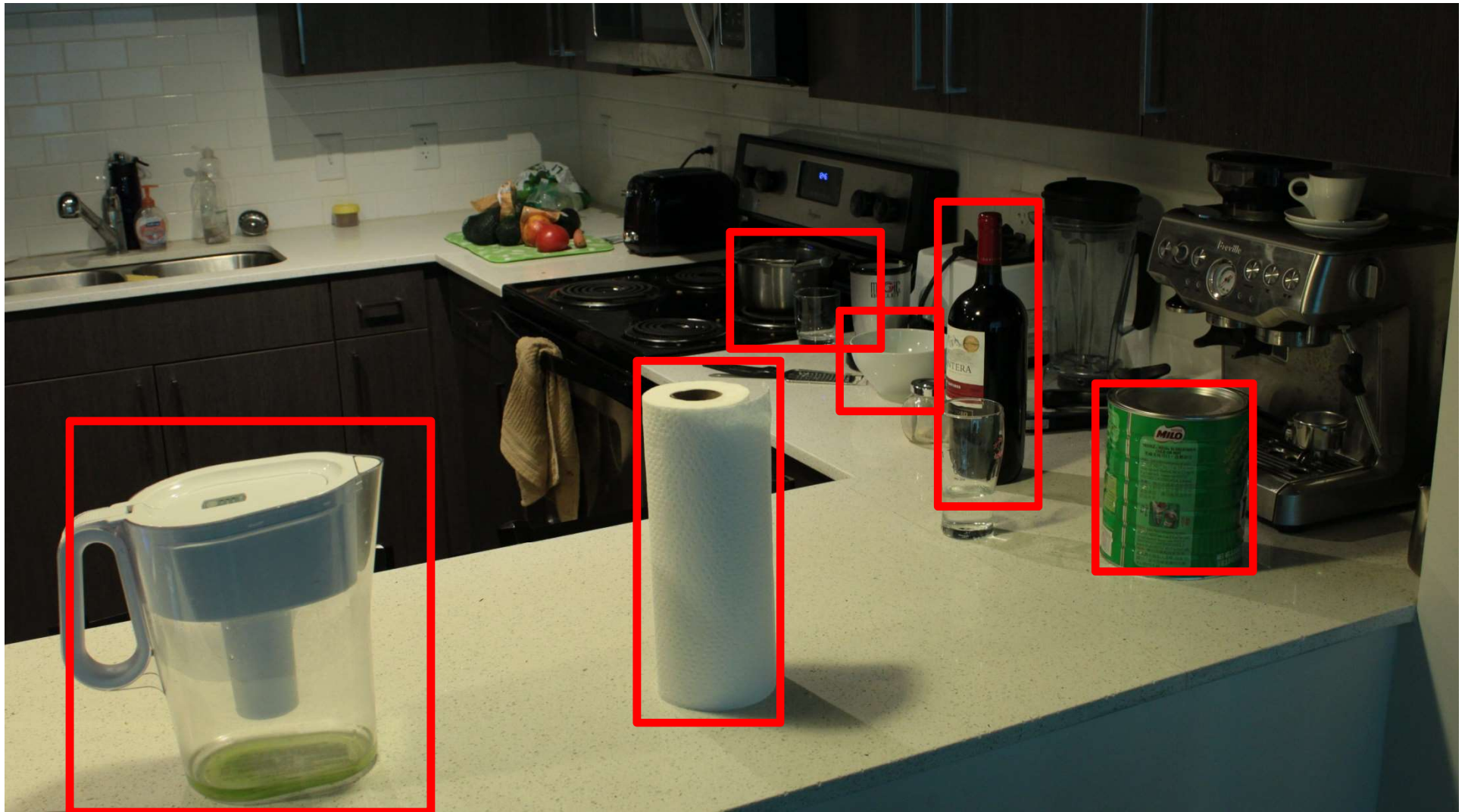
# Let's take an example environment...



And some hard objects ...



# Let's take an example environment...



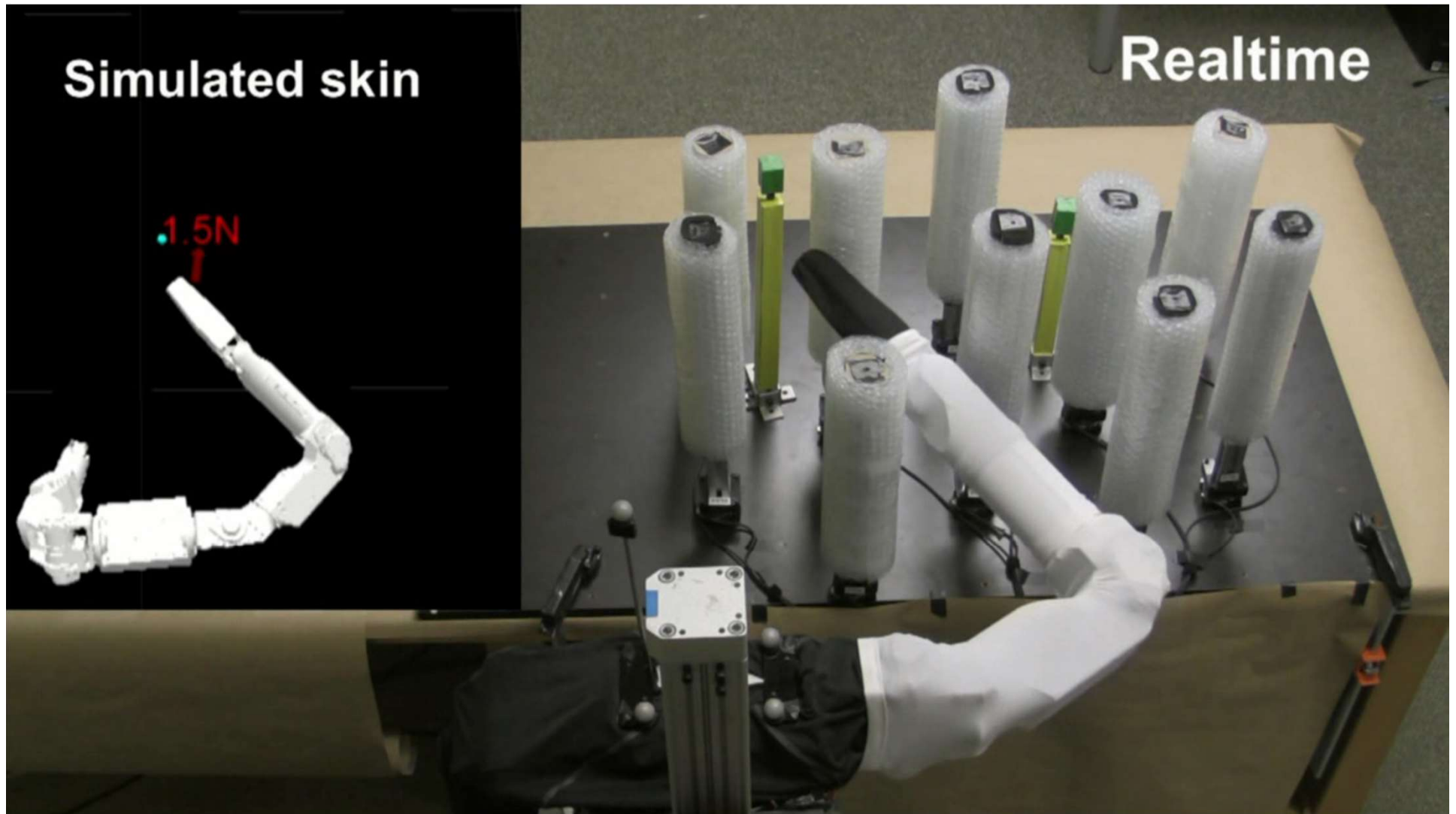
Also, during manipulation, objects can move

# Can you perceive the properties using vision alone ?



What about the sense of touch?  
Whole-arm tactile sensing!

# Autonomous Reaching



Advait Jain, Marc D. Killpack, Aaron Edsinger, and Charles C. Kemp, *Reaching in clutter with whole-arm tactile sensing*. The International Journal of Robotics Research, 2013.

# Assistive Scenarios

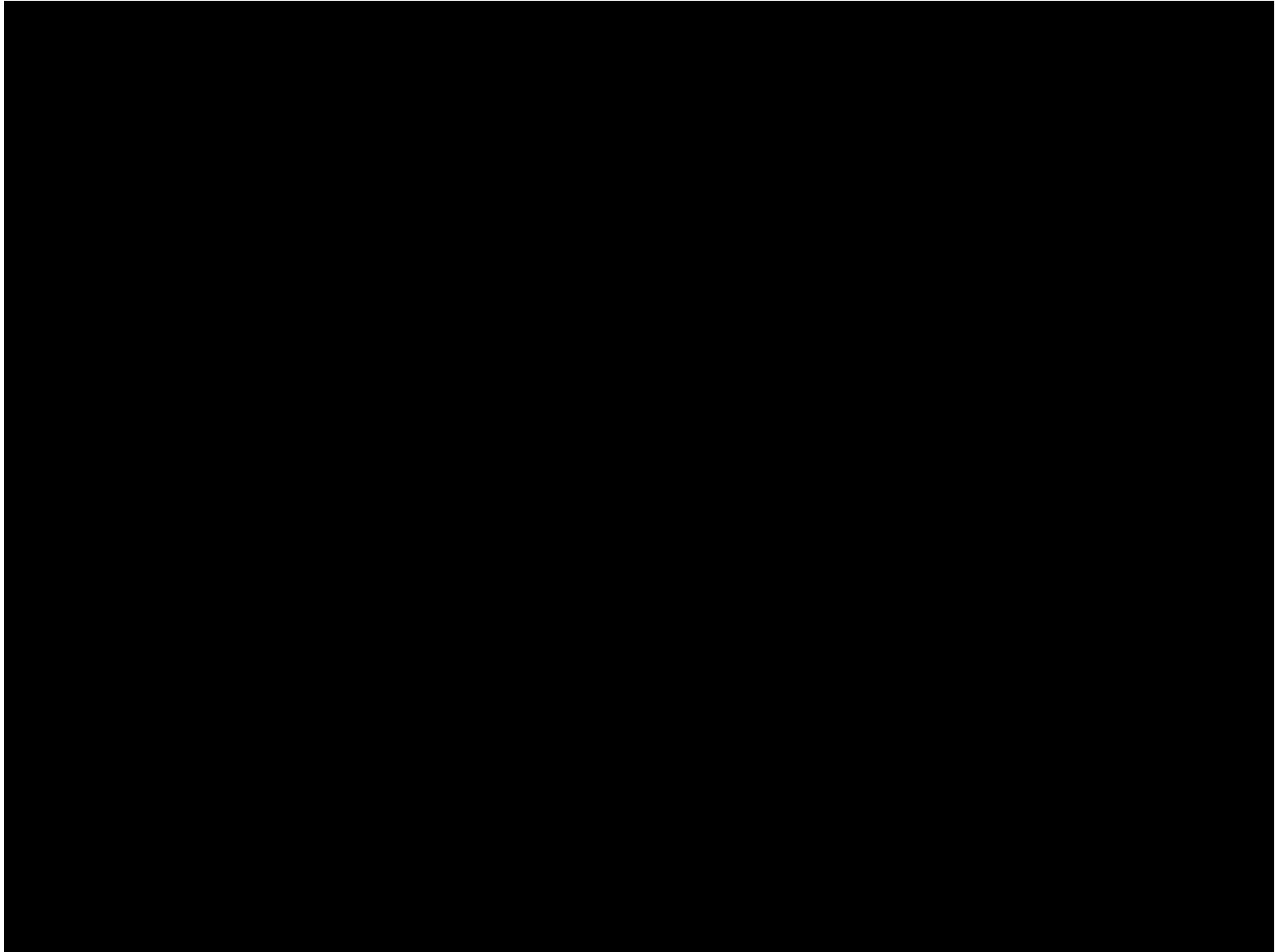


Phillip M. Grice, Marc D. Killpack, Advait Jain, Sarvagya Vaish, Jeffrey Hawke, and Charles C. Kemp, *Whole-arm Tactile Sensing for Beneficial and Acceptable Contact During Robotic Assistance*, 13th International Conference on Rehabilitation Robotics (ICORR), 2013.

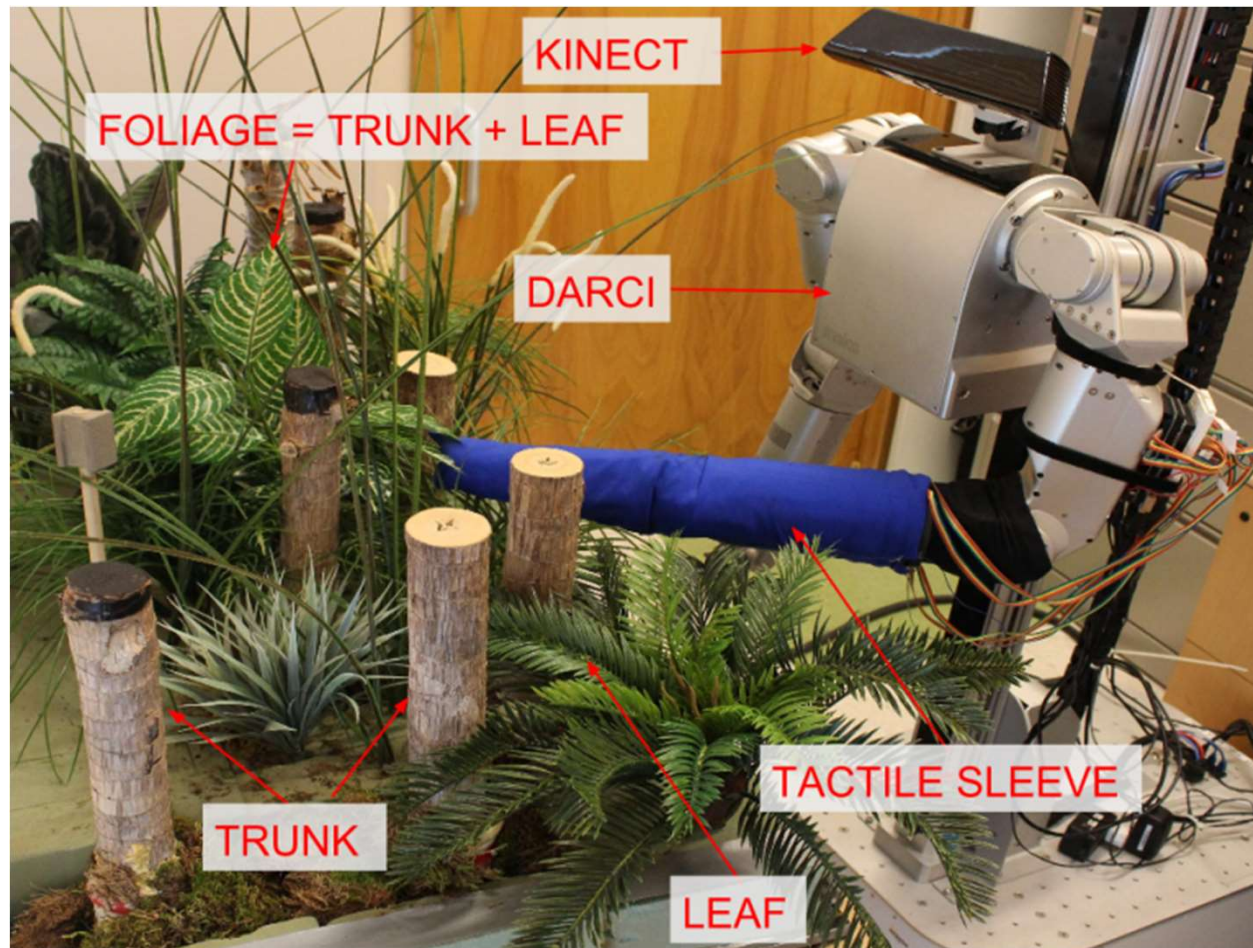
# Some examples of Contact



# **An artificial capacitive-sensing skin**



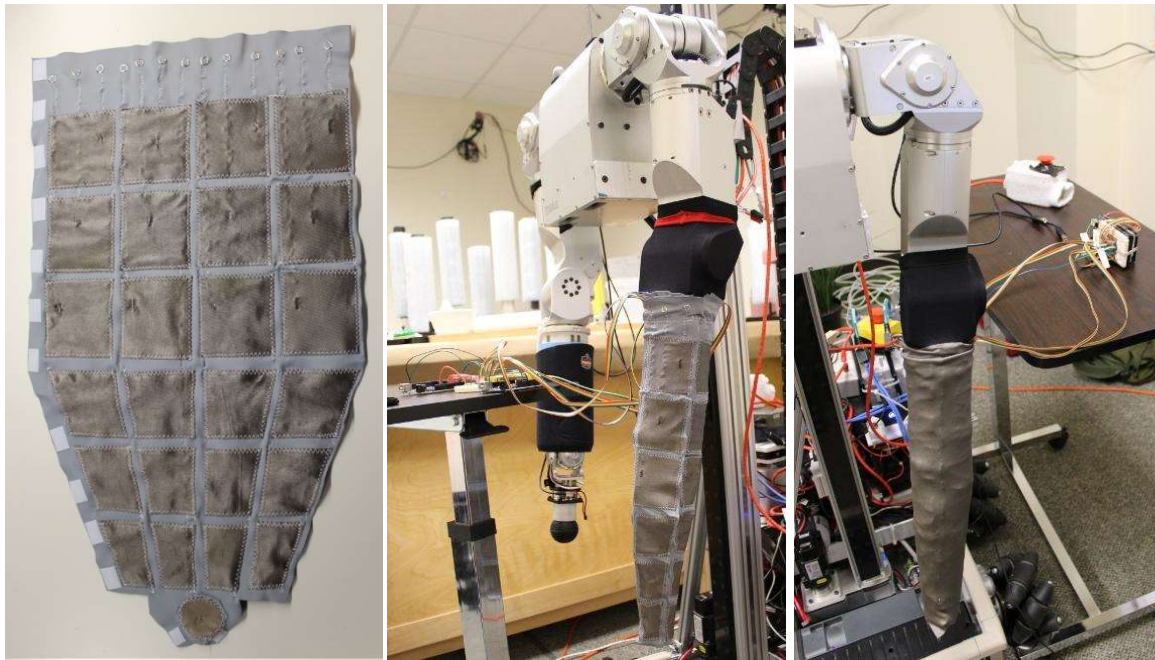
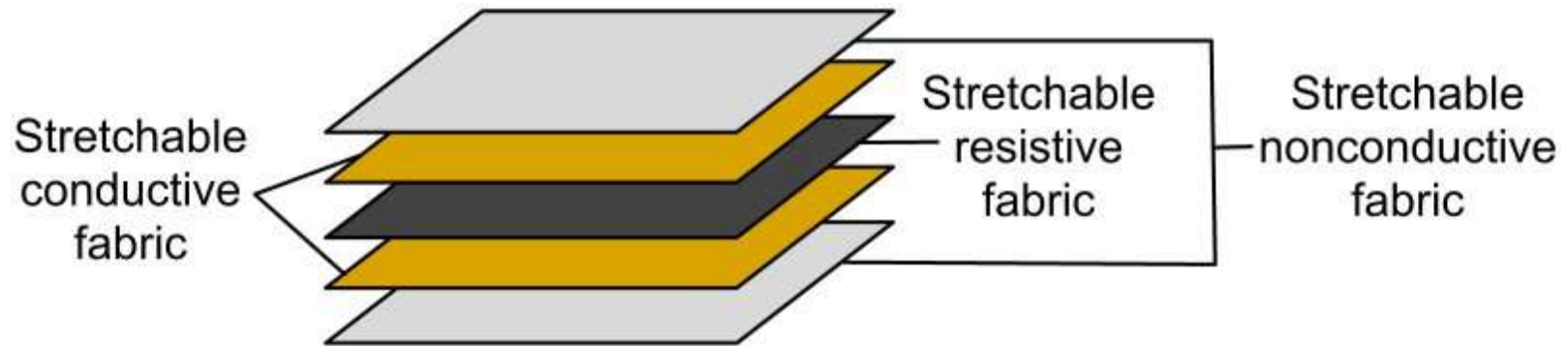
# But, how to cover joints?



**Stretchable Fabric-based Resistive Sleeve!**



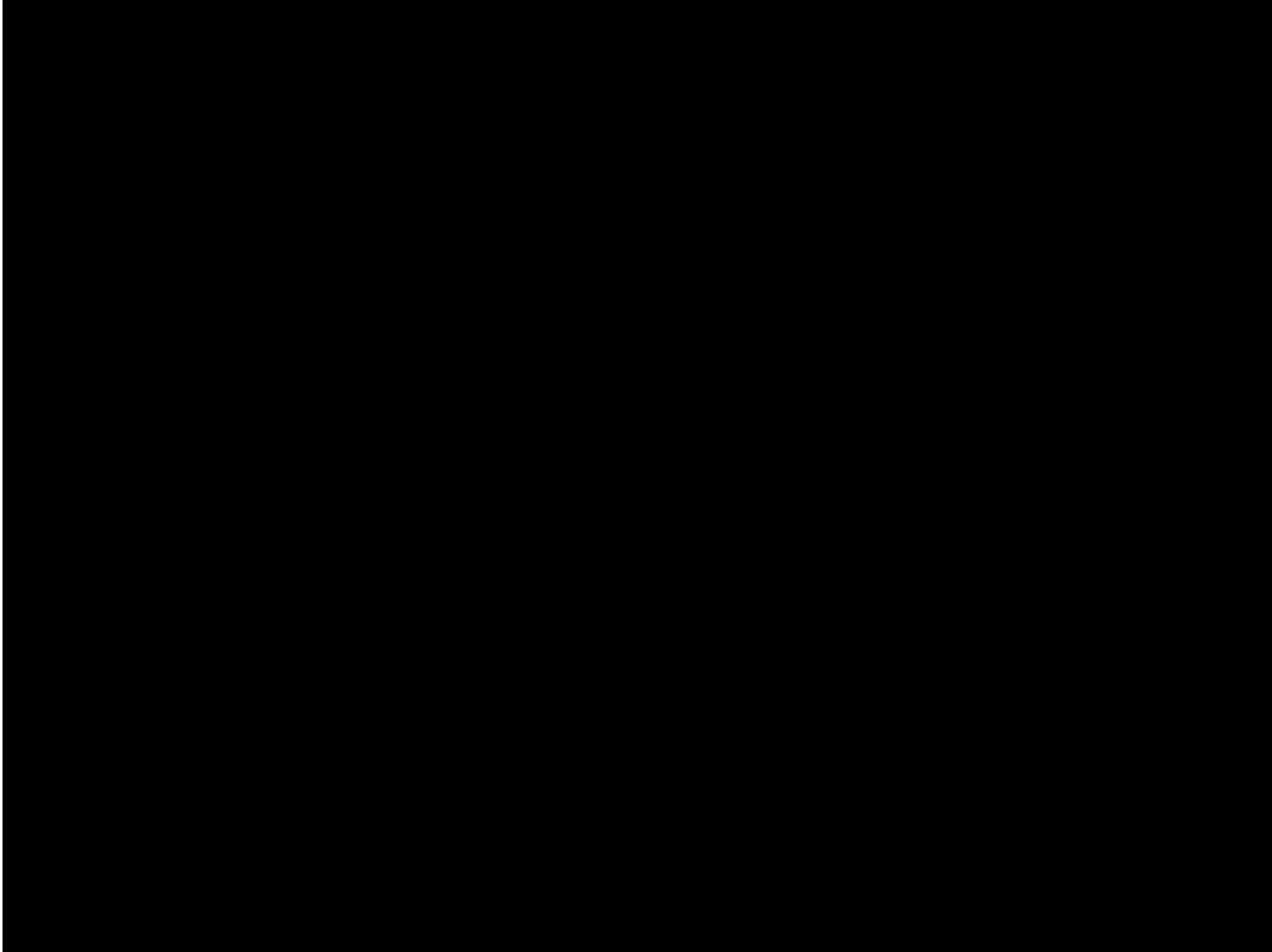
# Stretchable Fabric Tactile Sensors



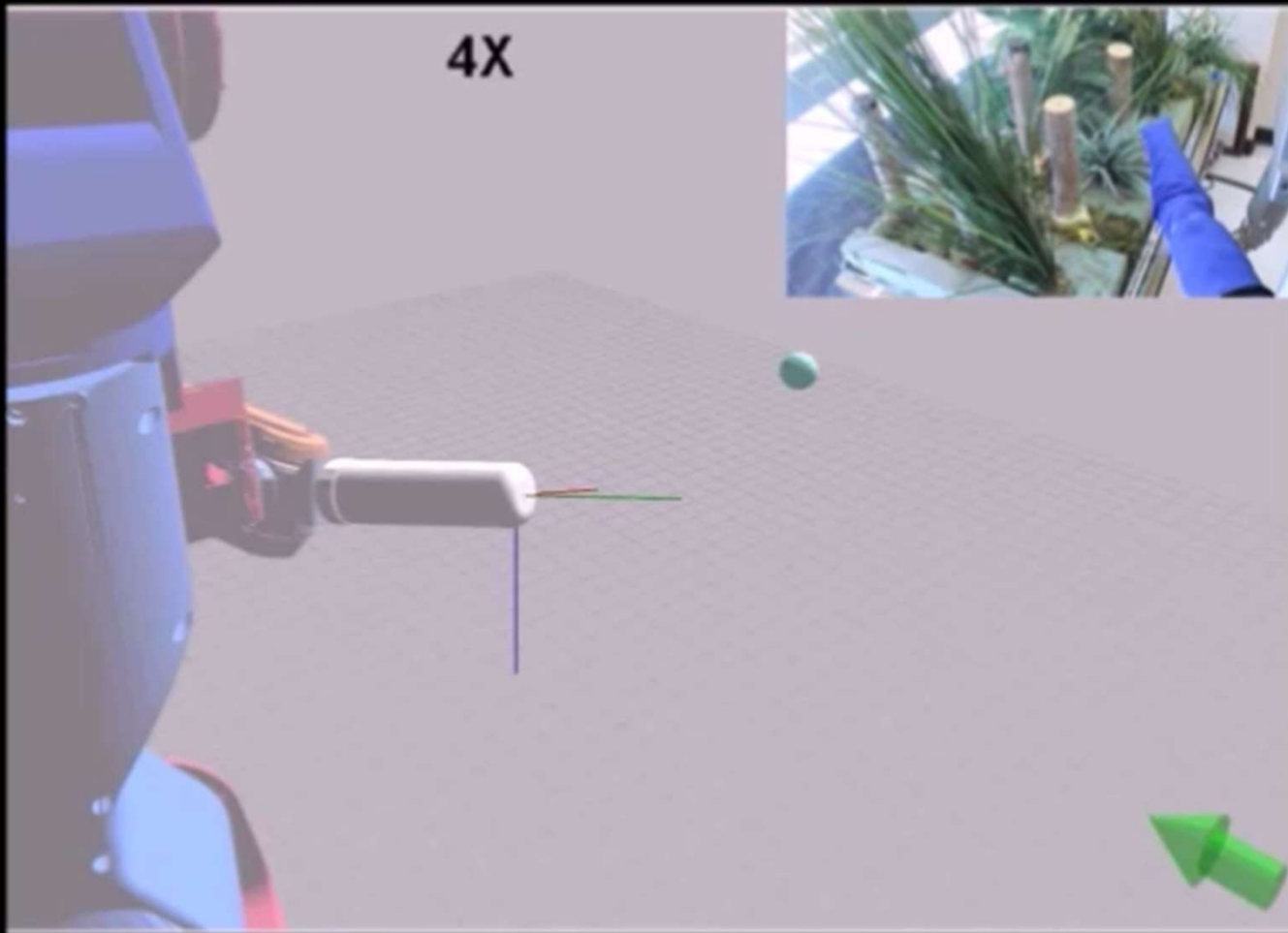
- **25 discrete tactile sensor elements (taxels)**
  - 12 on forearm
  - 13 on the gripper
- **Open hardware**

Tapomayukh Bhattacharjee, Advait Jain, Sarvagya Vaish, Marc D. Killpack, and Charles C. Kemp, Tactile Sensing over Articulated Joints with Stretchable Sensors, IEEE World Haptics Conference (WHC 2013), 2013

# Rapid Haptic Mapping : Force



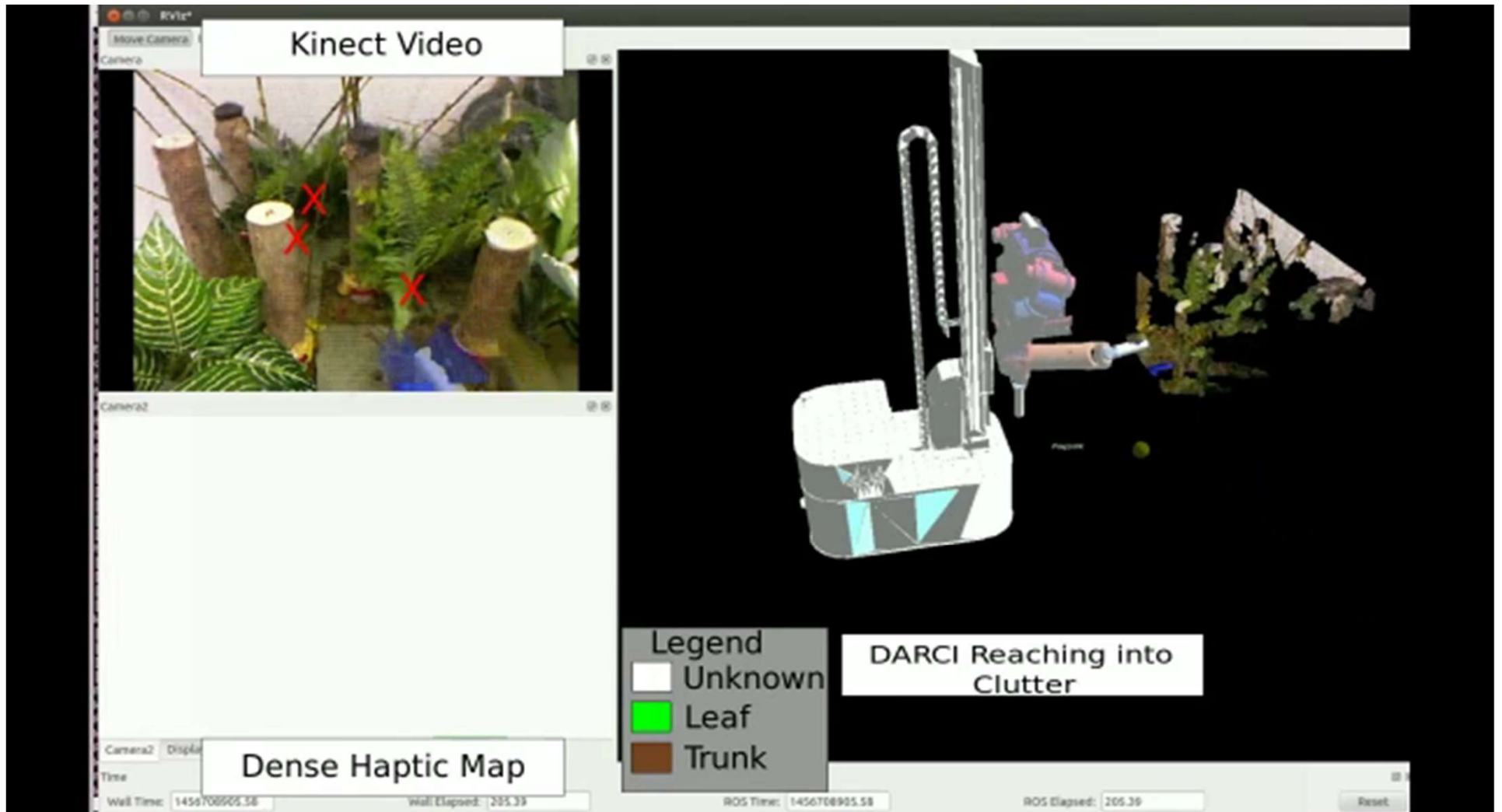
# Rapid Haptic Mapping : Force + Vision



**Dense Haptic map** used for planning, one try

**Tapomayukh Bhattacharjee**, Ashwin A. Shenoi, Daehyung Park, James M. Rehg, and Charles C. Kemp, *Combining Tactile Sensing and Vision for Rapid Haptic Mapping*, IEEE/RSJ International Conference on Intelligent Robots and Systems (IROS), 2015.

# Rapid Haptic Mapping : Force + Vision



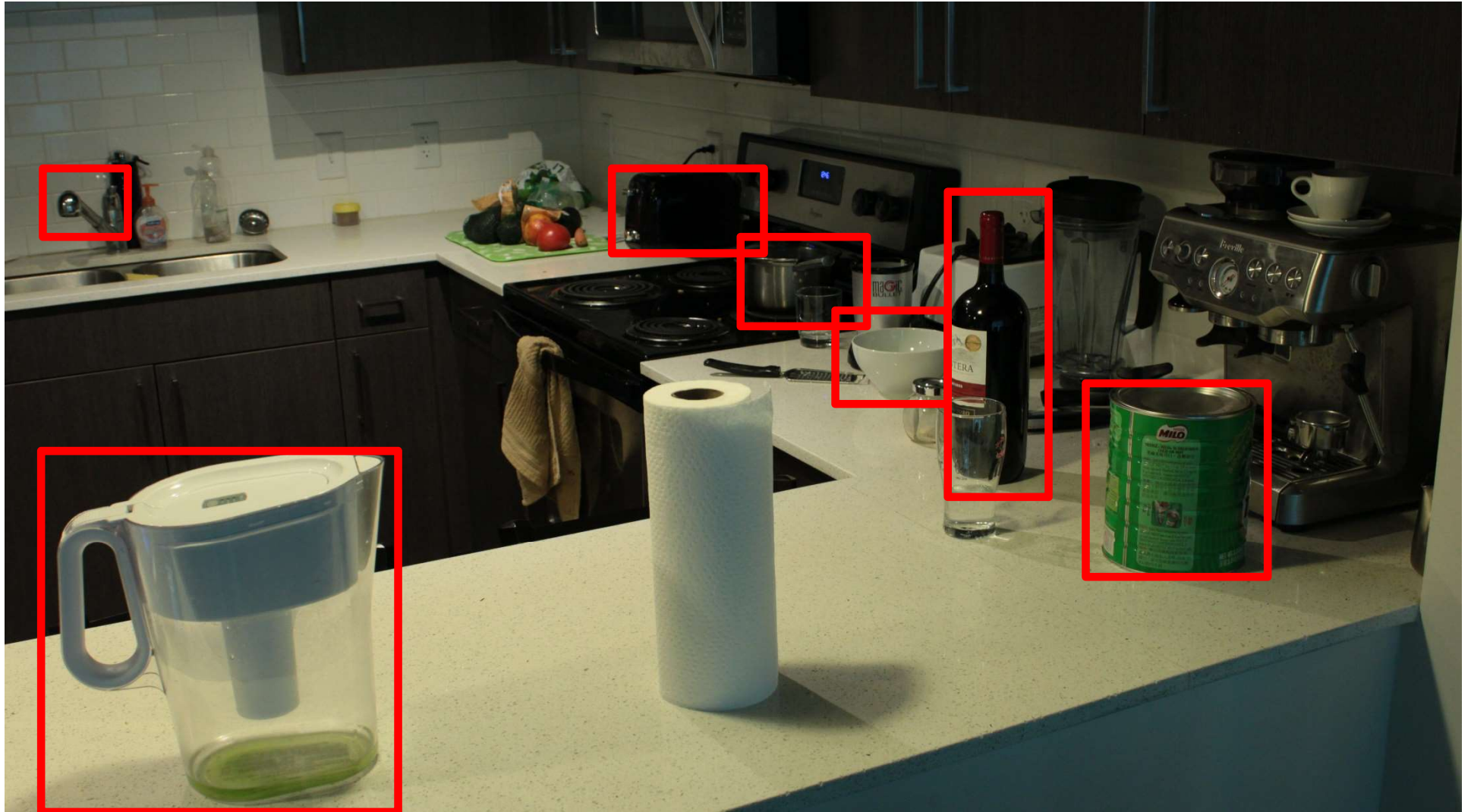
Dense Haptic map

# Let's revisit example environment...



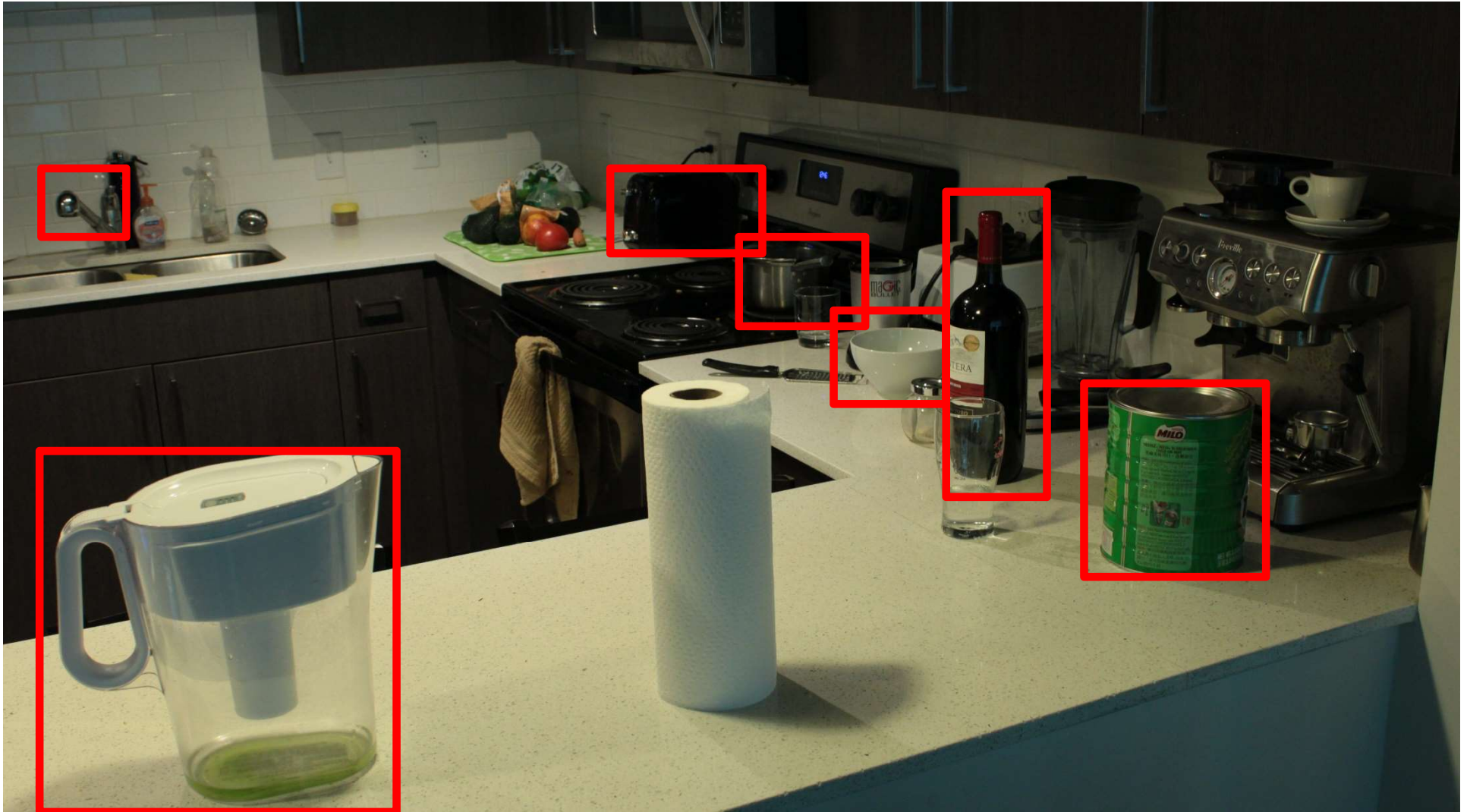
**A Kitchen**

# Let's revisit example environment...



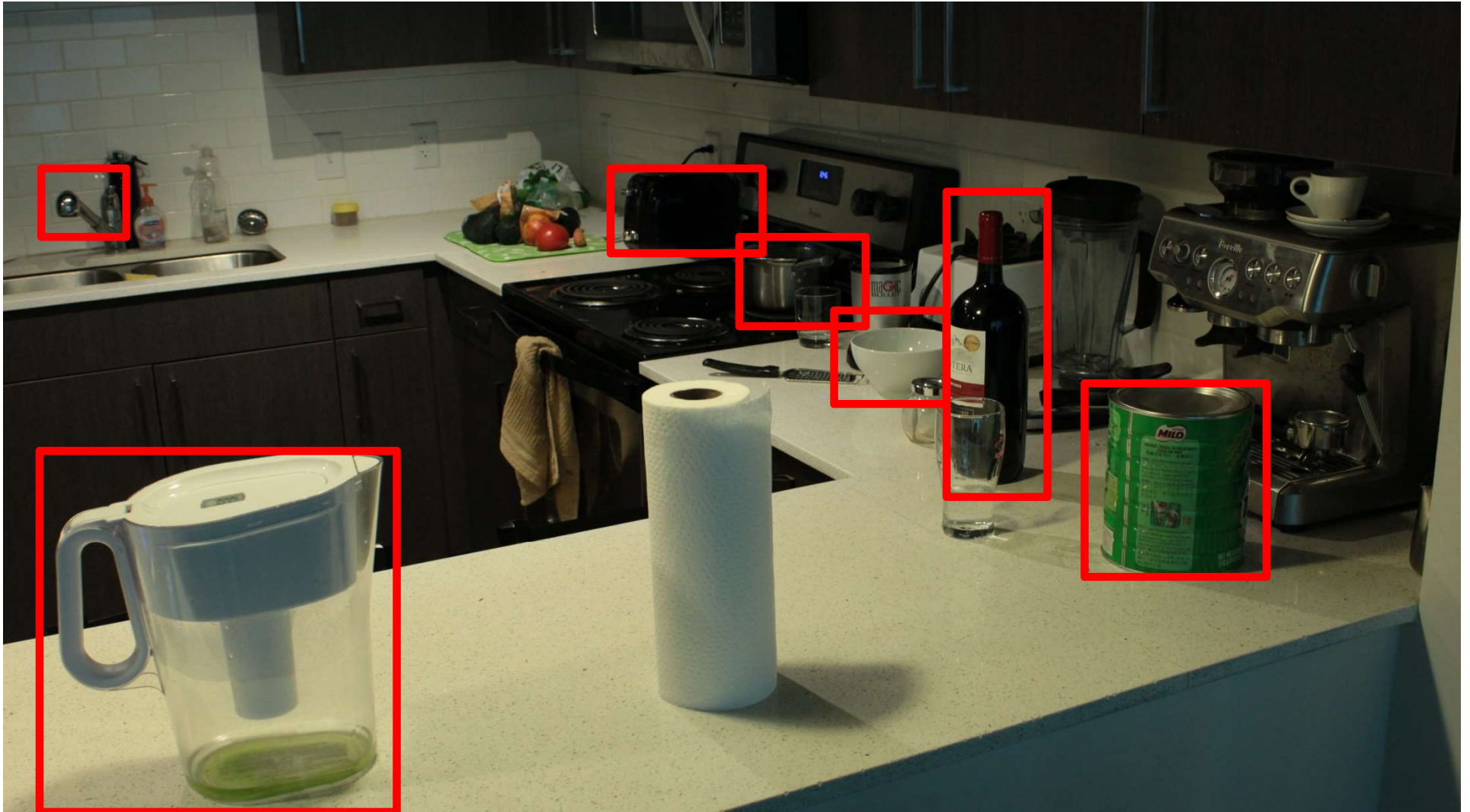
We have some hard objects ...

# Let's revisit example environment...



**But, can a robot distinguish material properties of the hard objects using force sensing ?**

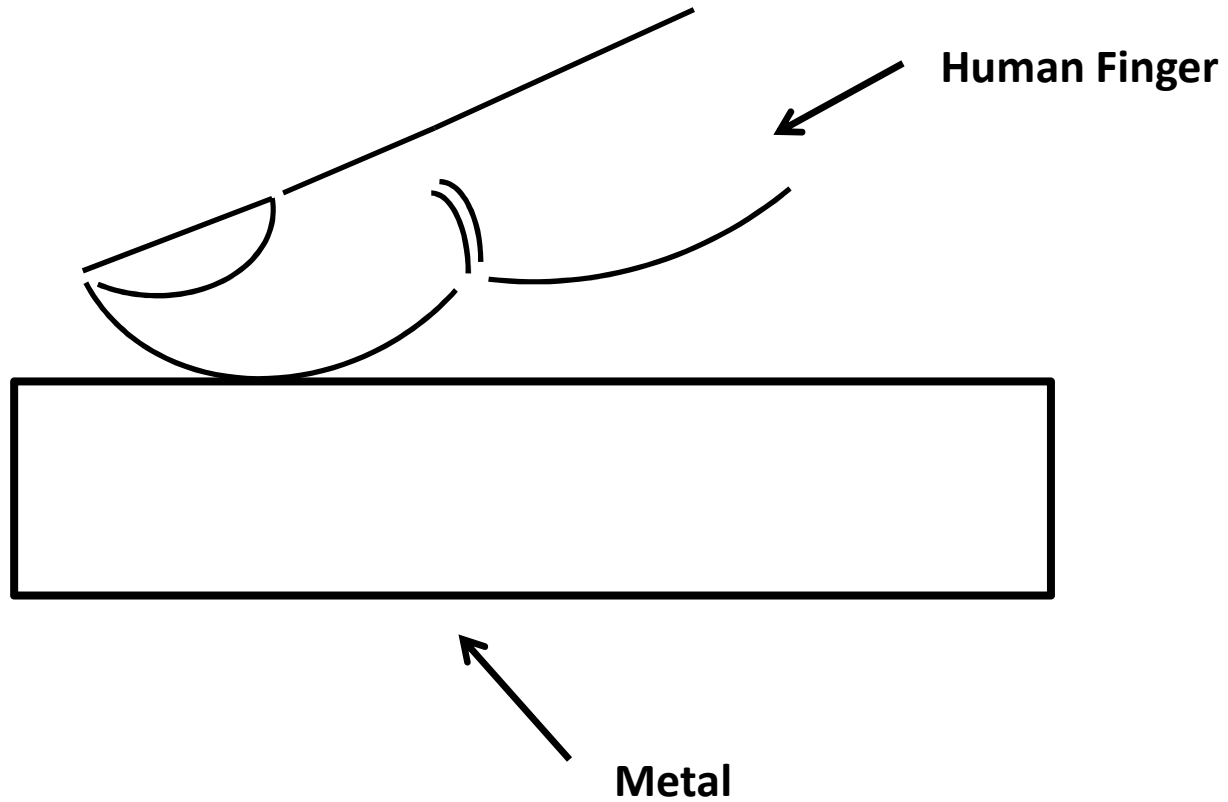
# Let's revisit example environment...



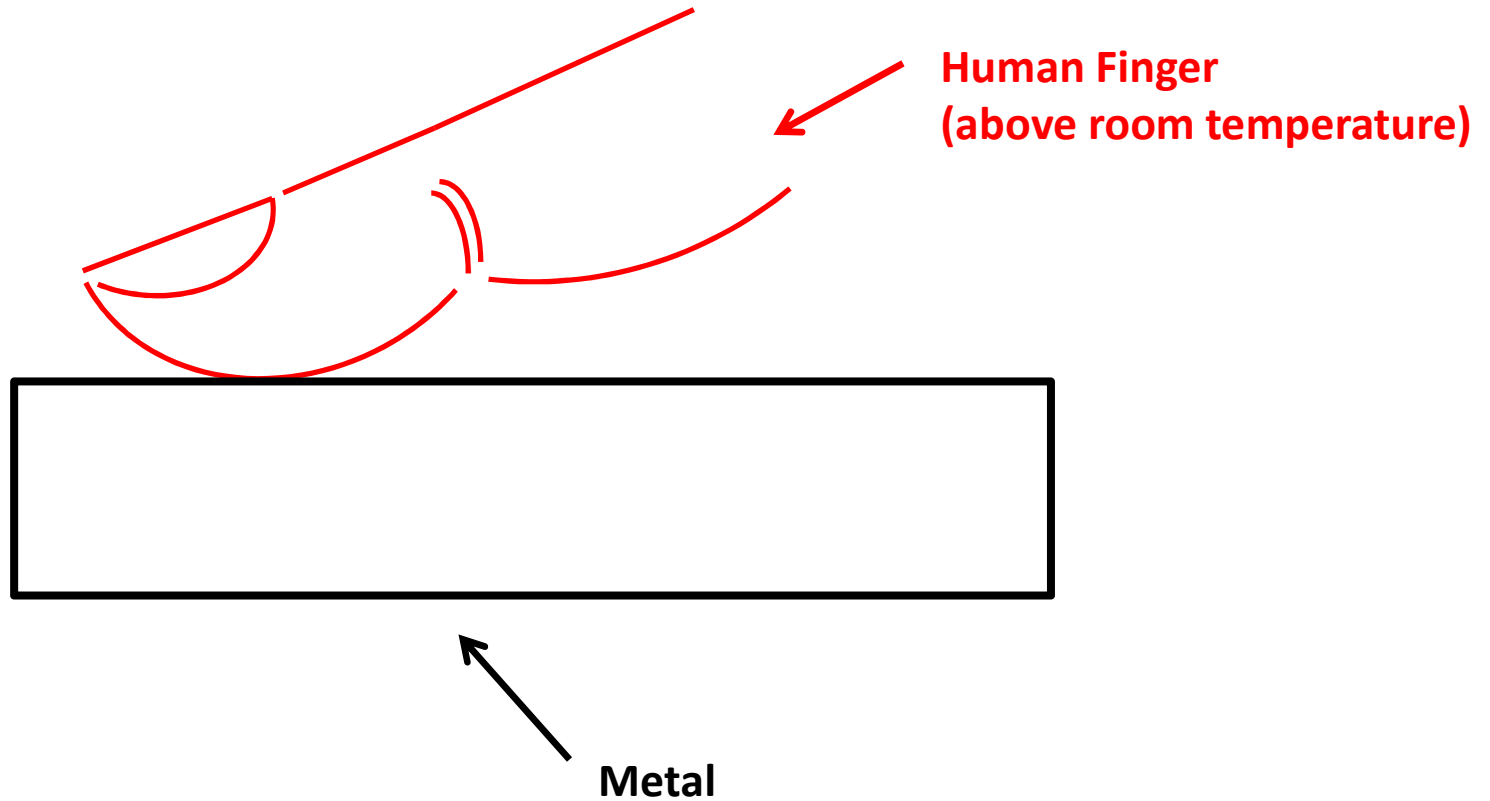
**They may have different thermal properties ! What can we do with thermal sensing ?**



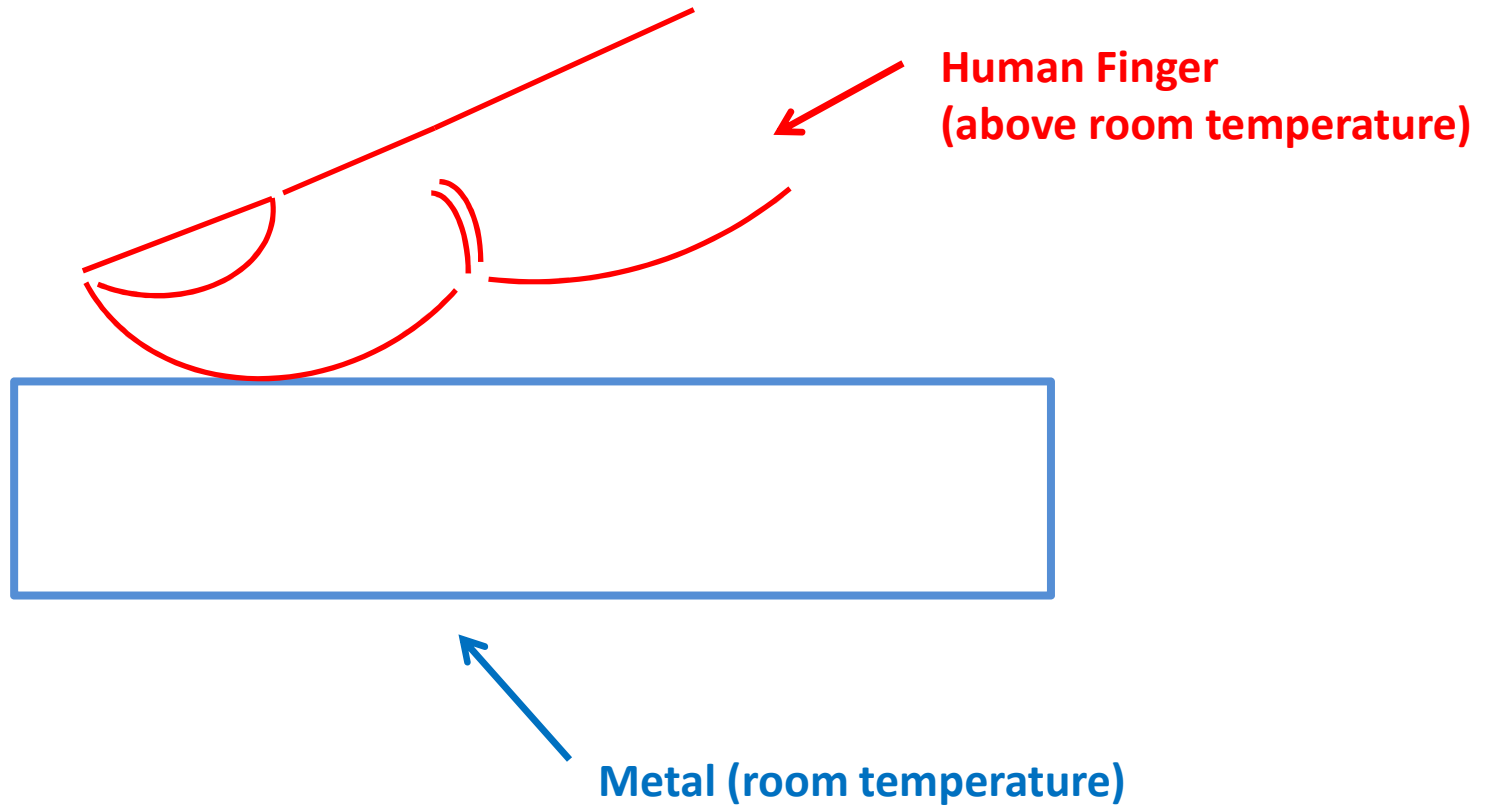
# Active Thermal Sensing



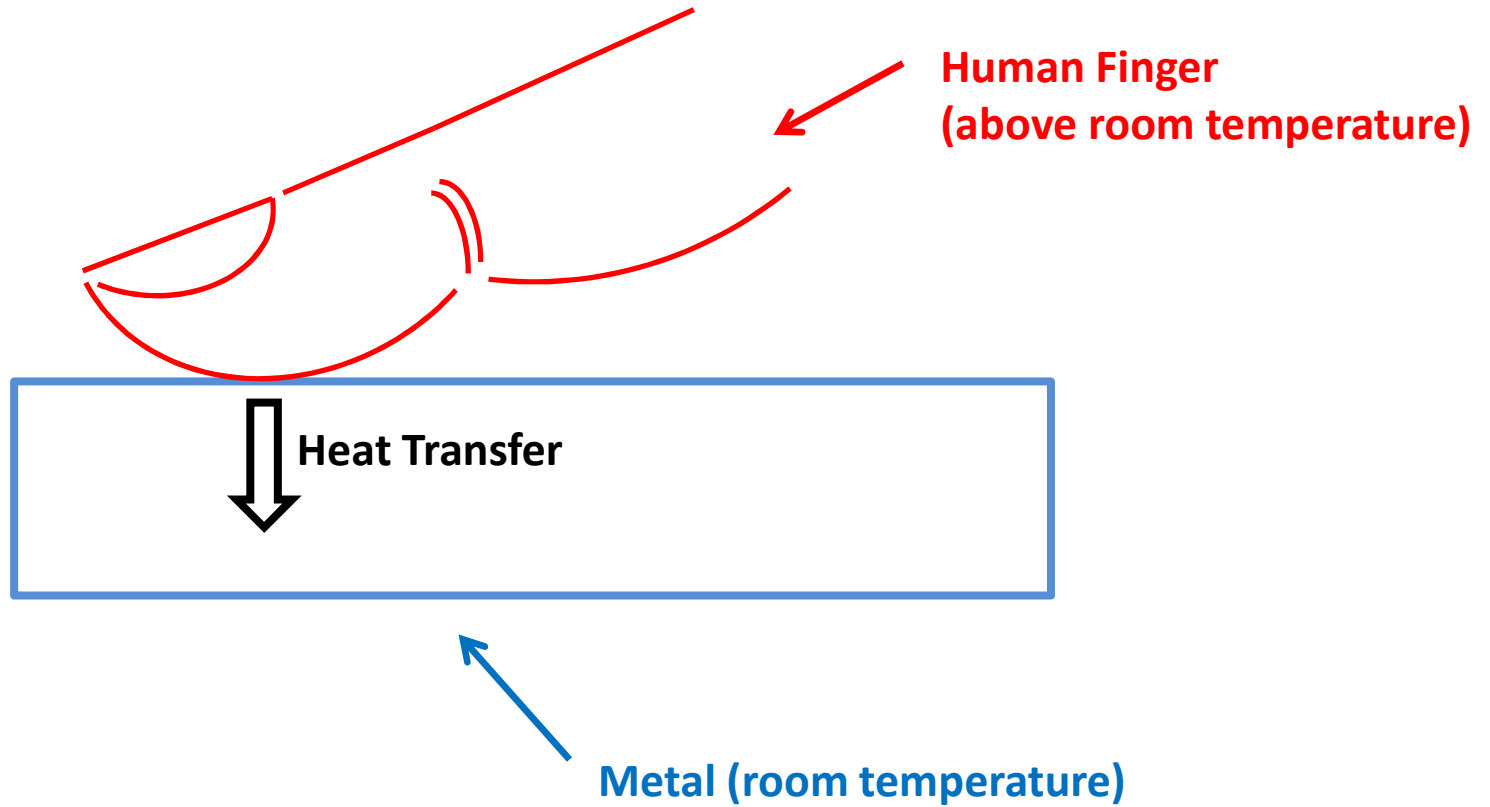
# Active Thermal Sensing



# Active Thermal Sensing



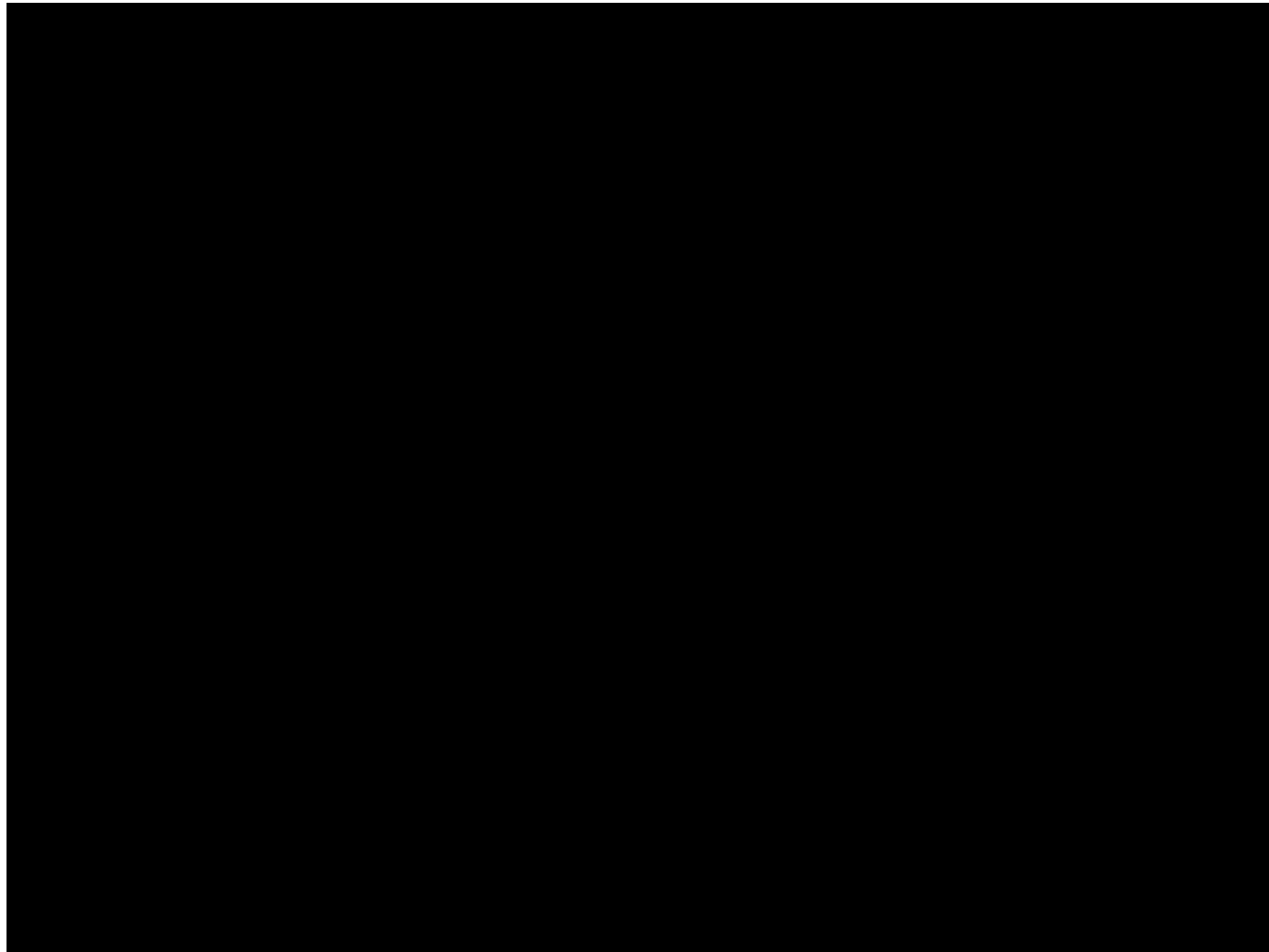
# Active Thermal Sensing



# Passive thermal sensing

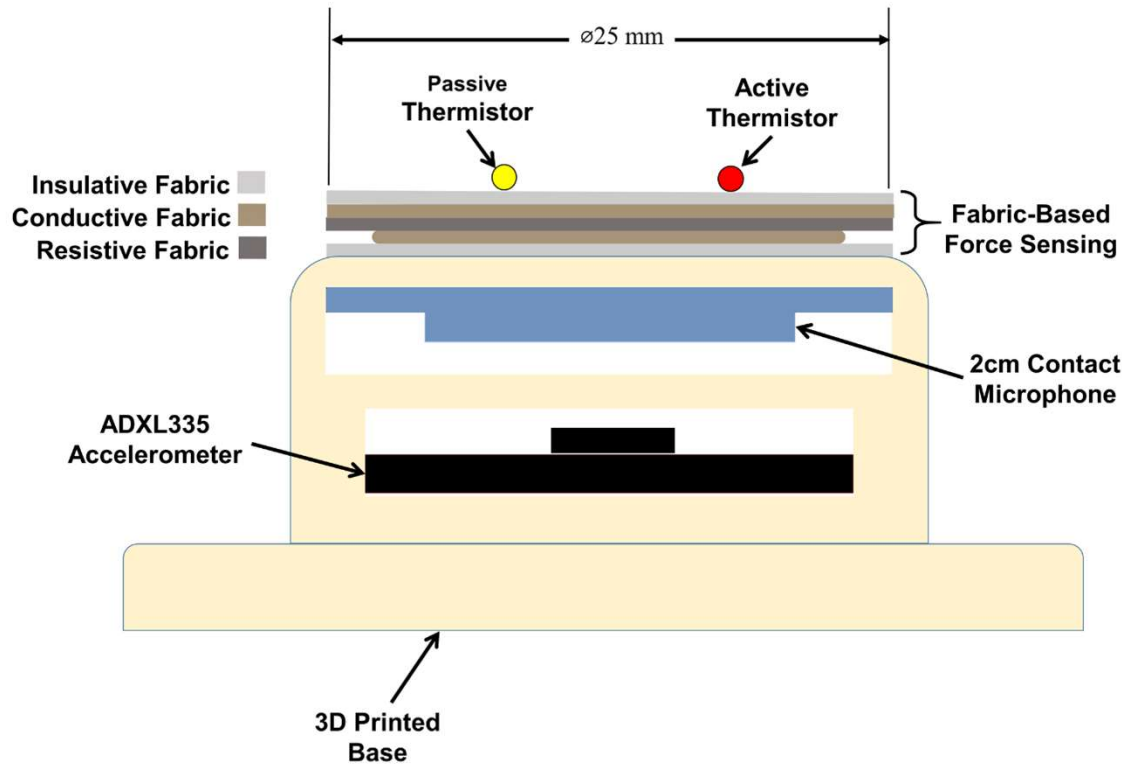


# **A simple 1-DOF device as a testbed**



**What if we combine force and thermal ?**

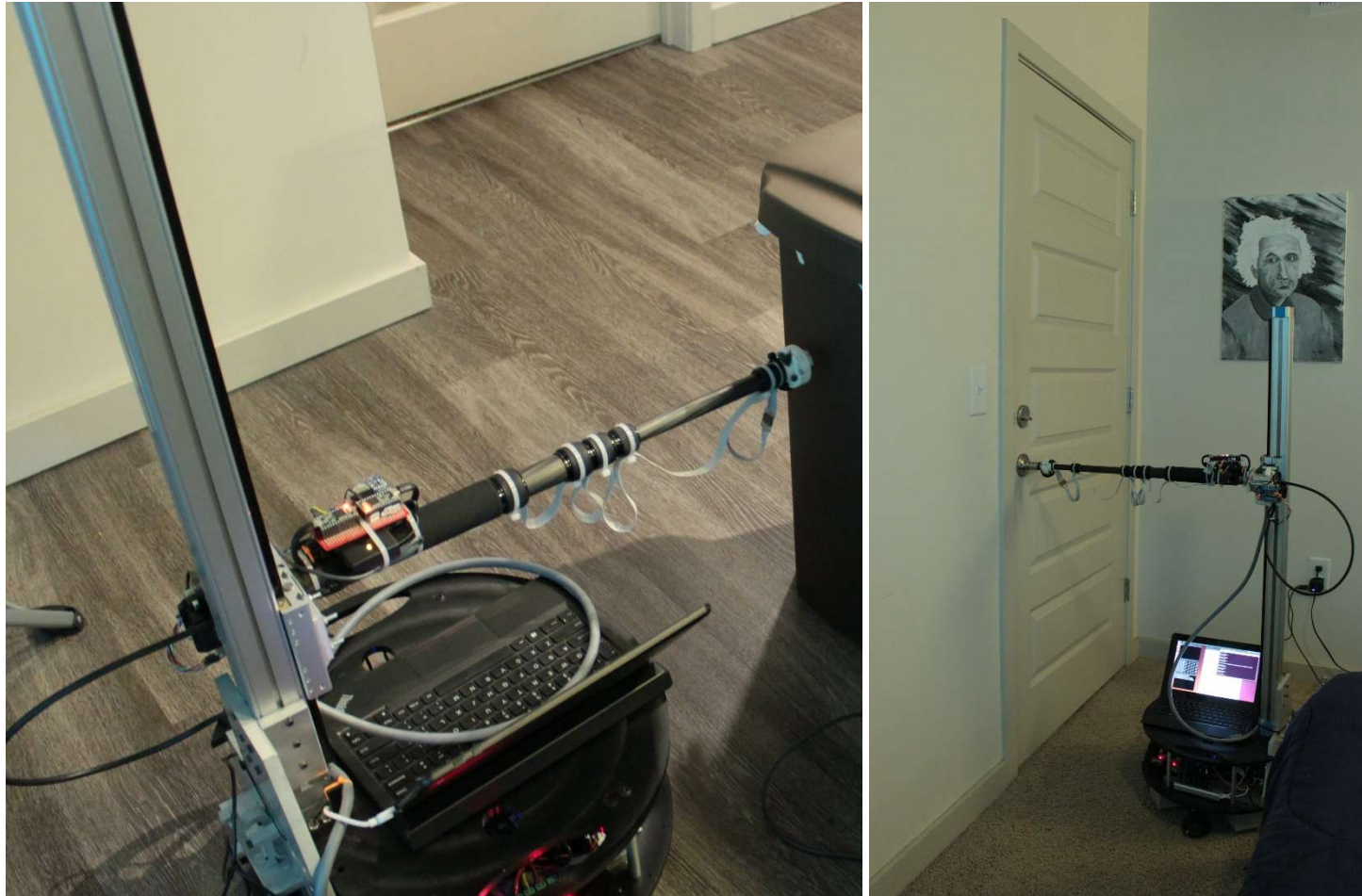
# A Multimodal Sensing Module ...



**Tapomayukh Bhattacharjee**, Joshua Wade, Henry M. Clever, and Charles C. Kemp, *Generalizing In-Situ Multimodal Haptic Perception Performance during Rapid First Contact*, in preparation, 2017.



# ... attached to a Linear Actuator on a Mobile Robot...

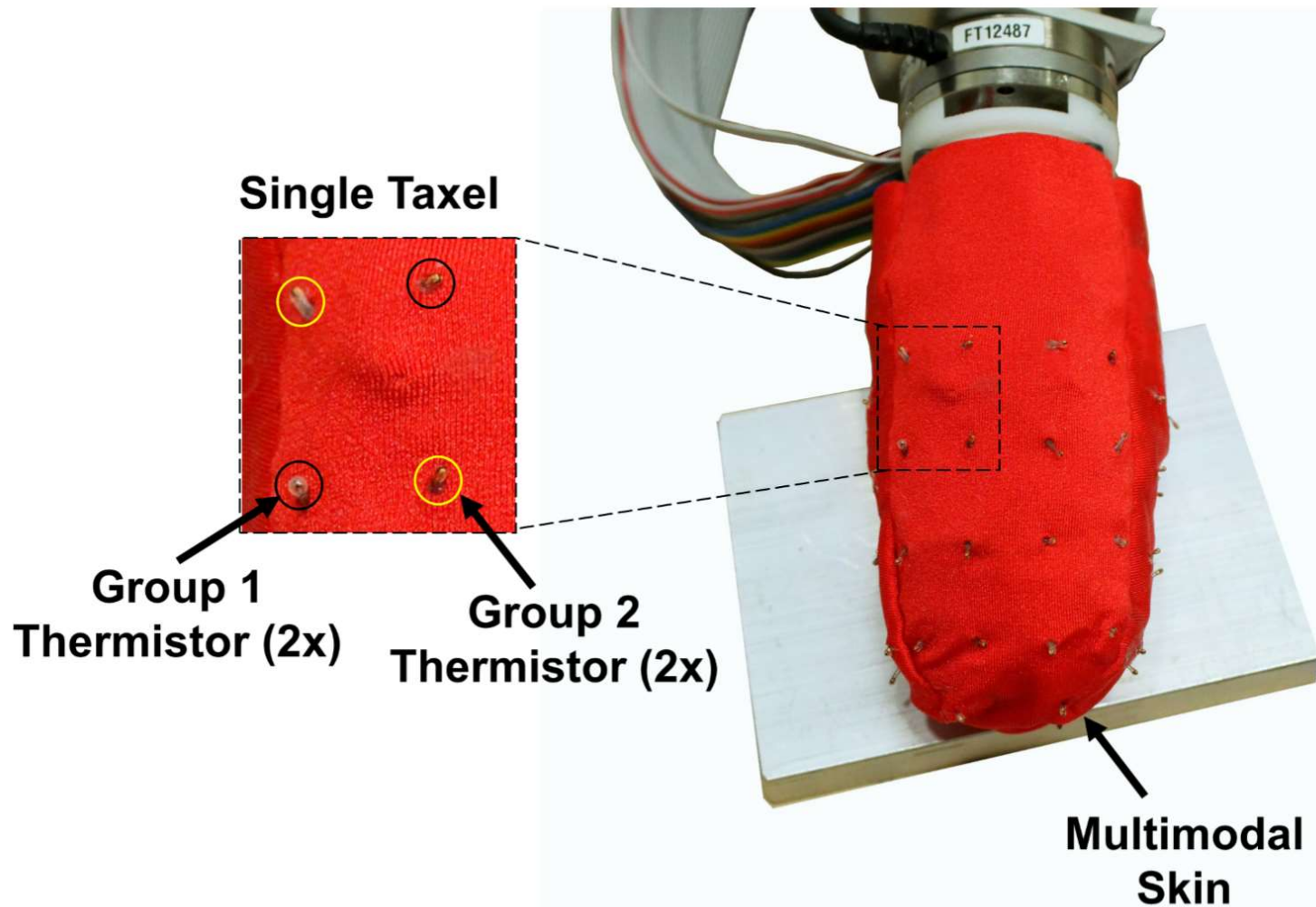


**Tapomayukh Bhattacharjee**, Joshua Wade, Henry M. Clever, and Charles C. Kemp, *Generalizing In-Situ Multimodal Haptic Perception Performance during Rapid First Contact*, in preparation, 2017.

**... perceived objects in a real home!**

A mobile robot with a multimodal sensor  
touching various objects ...

# Force and Thermal Sensing with a Fabric-Based Skin



Joshua Wade, **Tapomayukh Bhattacharjee**, Ryan D. Williams, and Charles C. Kemp, *A Force and Thermal Sensing Skin for Robots in Human Environments*, Under Review, 2017.

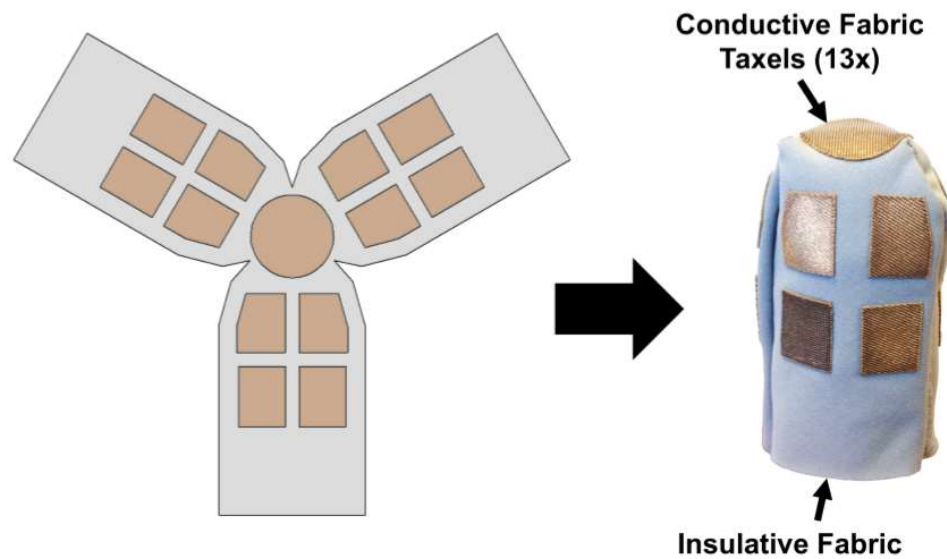


Figure 2: Arrangement of force sensing taxels on our multimodal skin prototype.

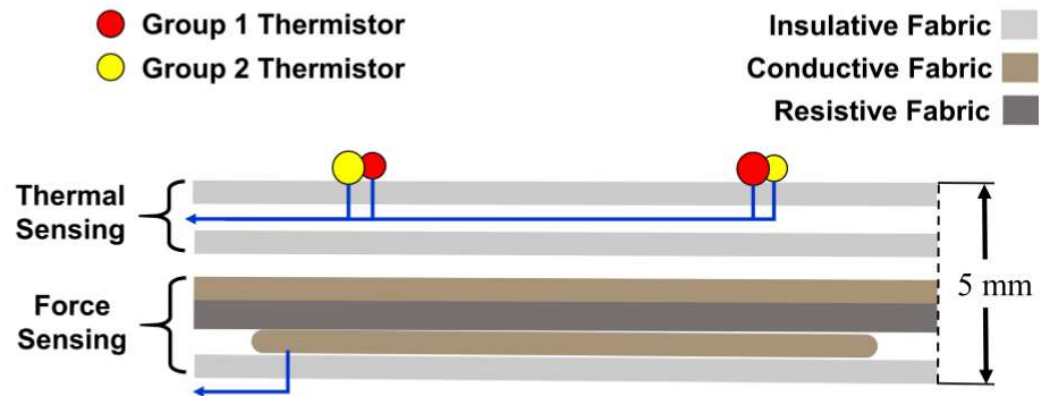
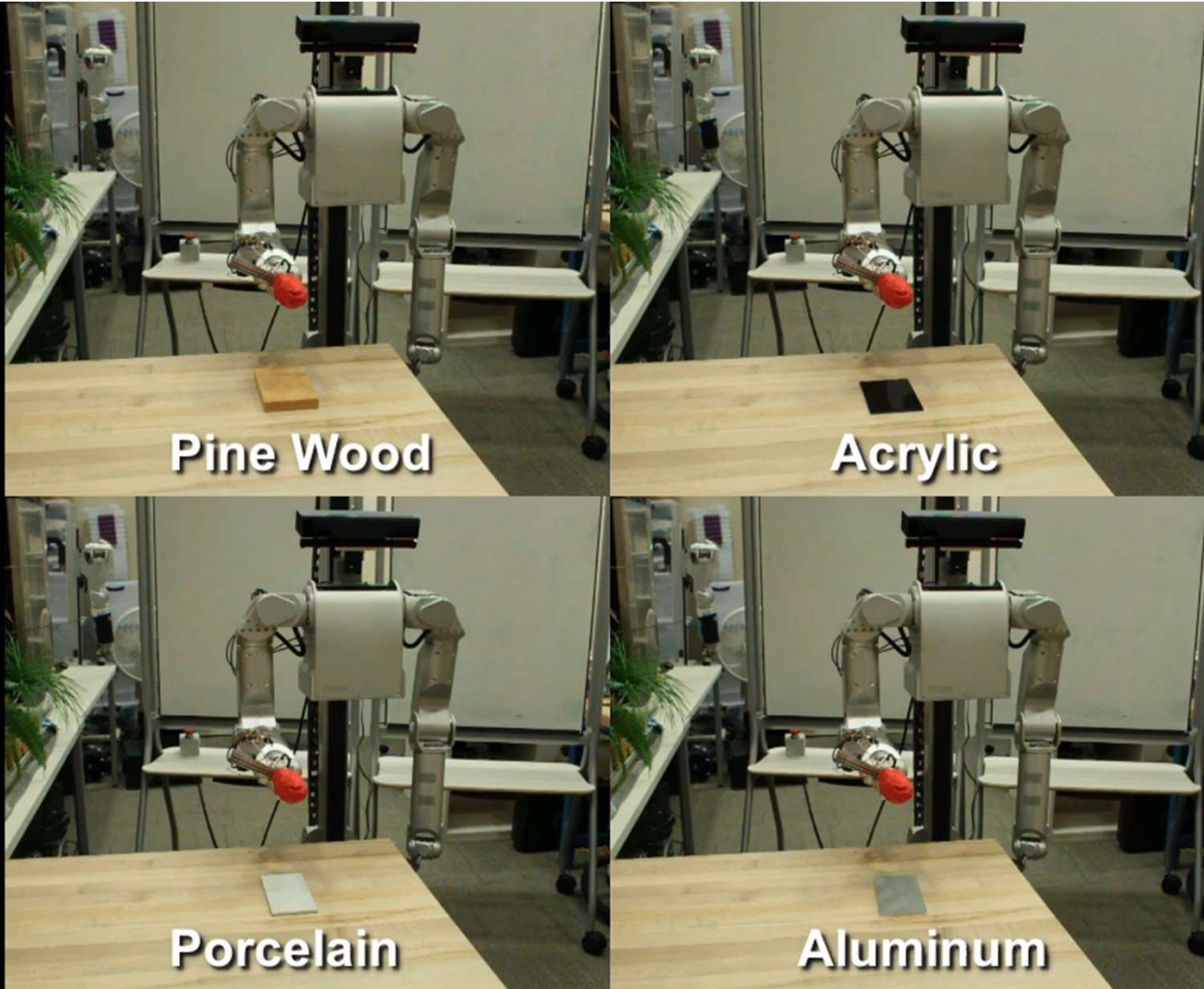
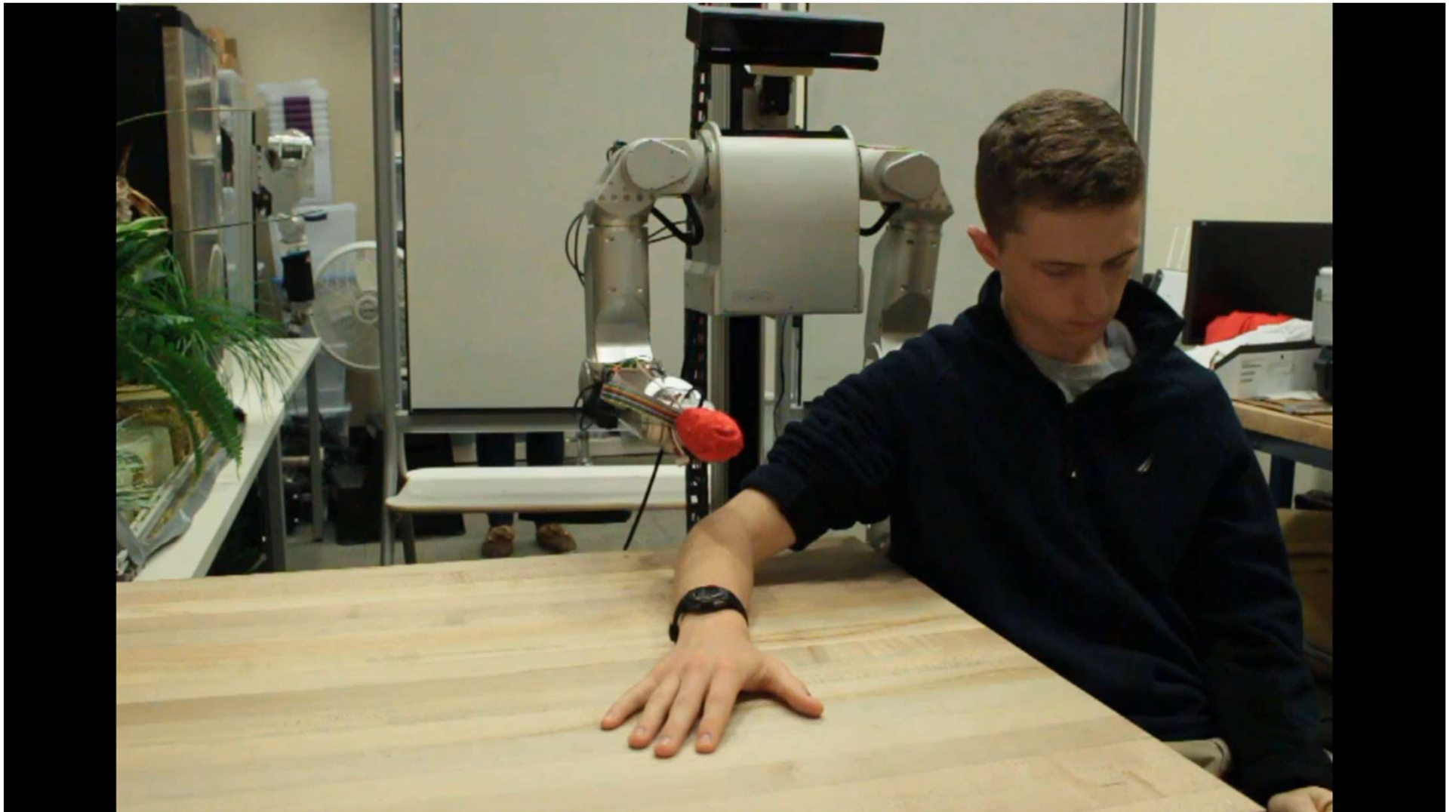


Figure 3: Multimodal taxel design.

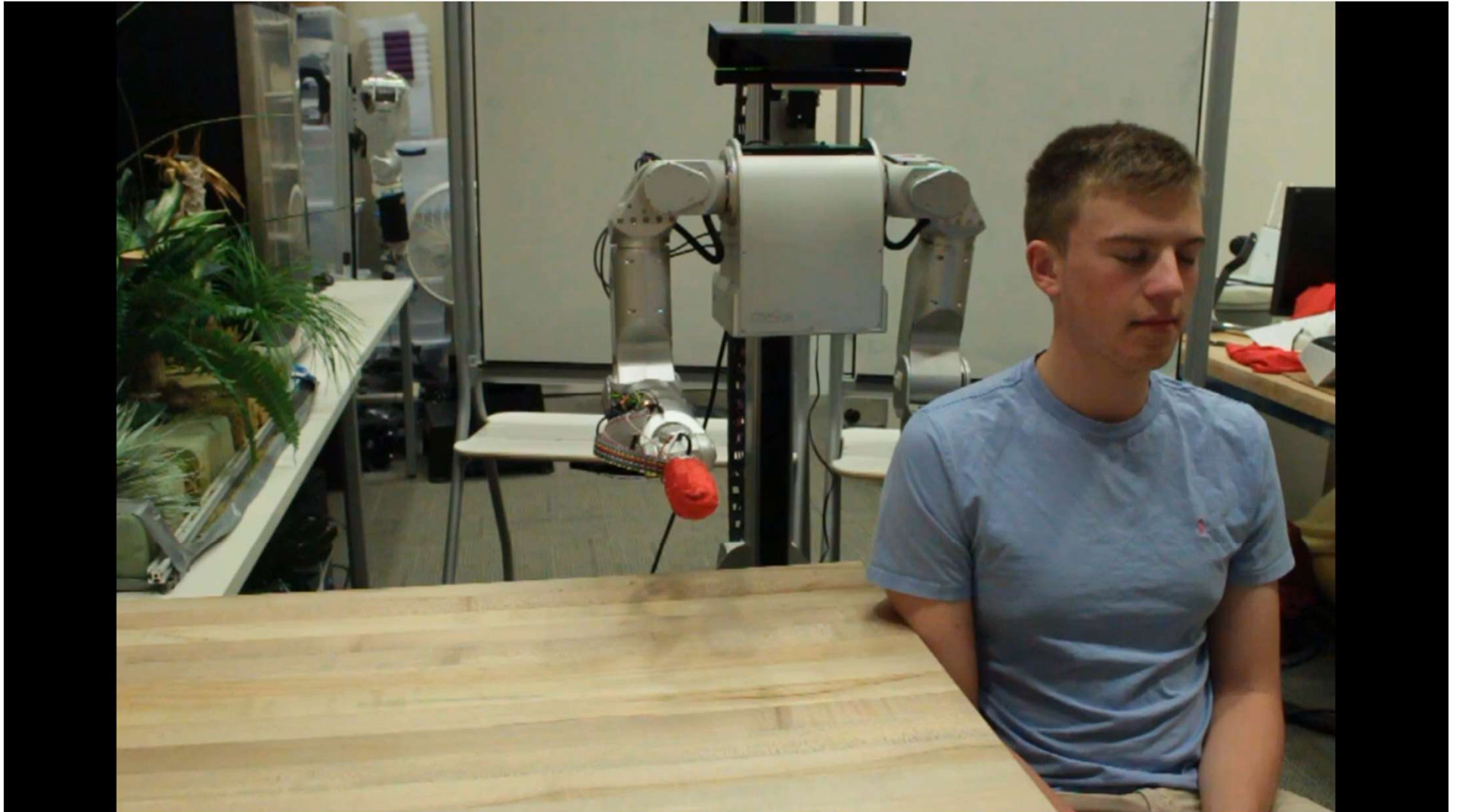
# Contact with Materials



# Contact with Human Body : Bare Forearm



# Contact with Human Body : Clothed Shoulder



# Take-Home Message

- Robotics is highly interdisciplinary
- Physical interaction with the world is hard for robots!



# Questions ?



Email: [tapo@cs.washington.edu](mailto:tapo@cs.washington.edu)