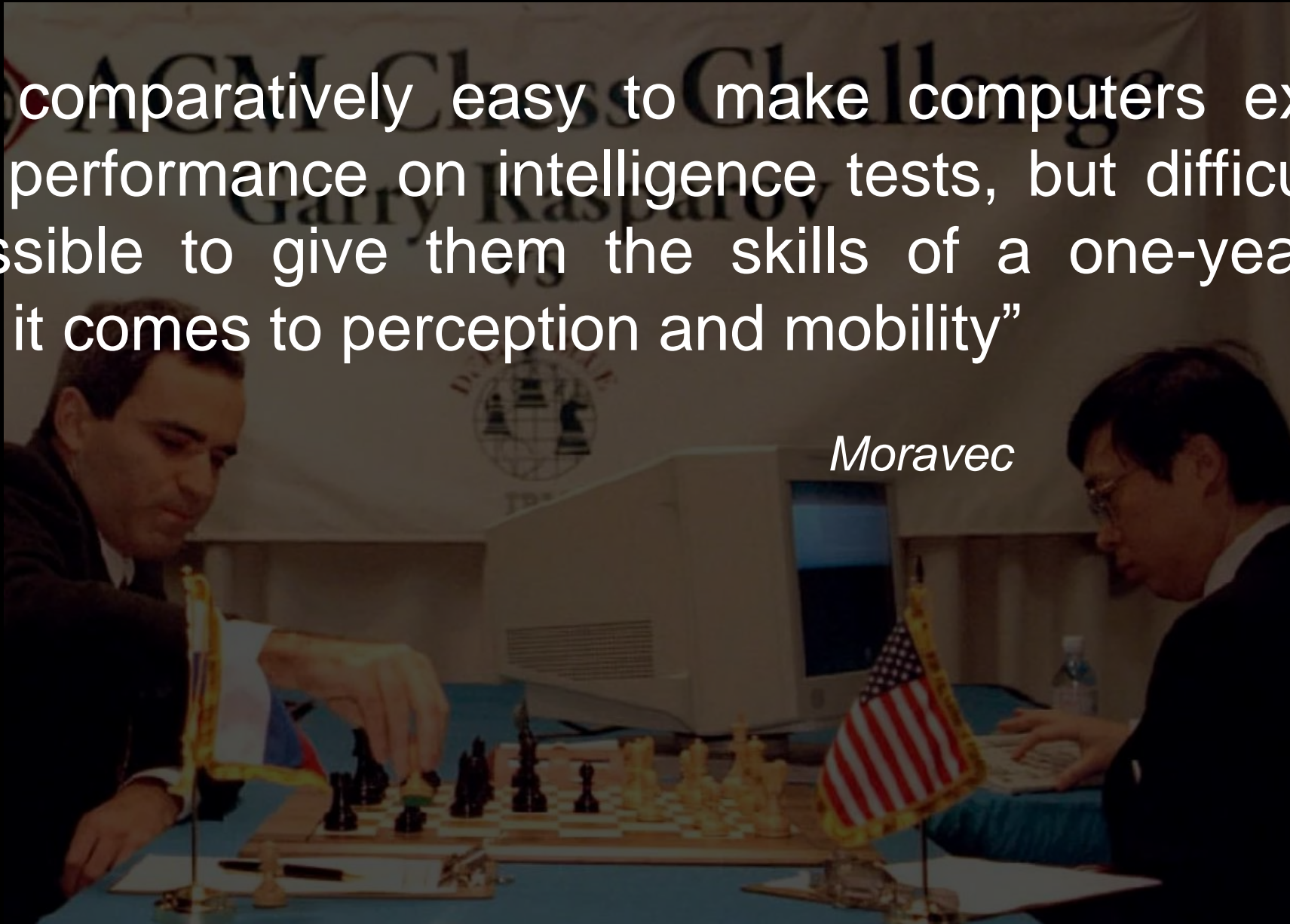
The background of the slide features two hands. On the left is a human hand in a light brown color, with a blue sleeve visible at the wrist. On the right is a grey robotic hand with visible joints and segments. The title text is centered over the human hand.

Getting a grip on the tactile perception of frictional information in humans and robots

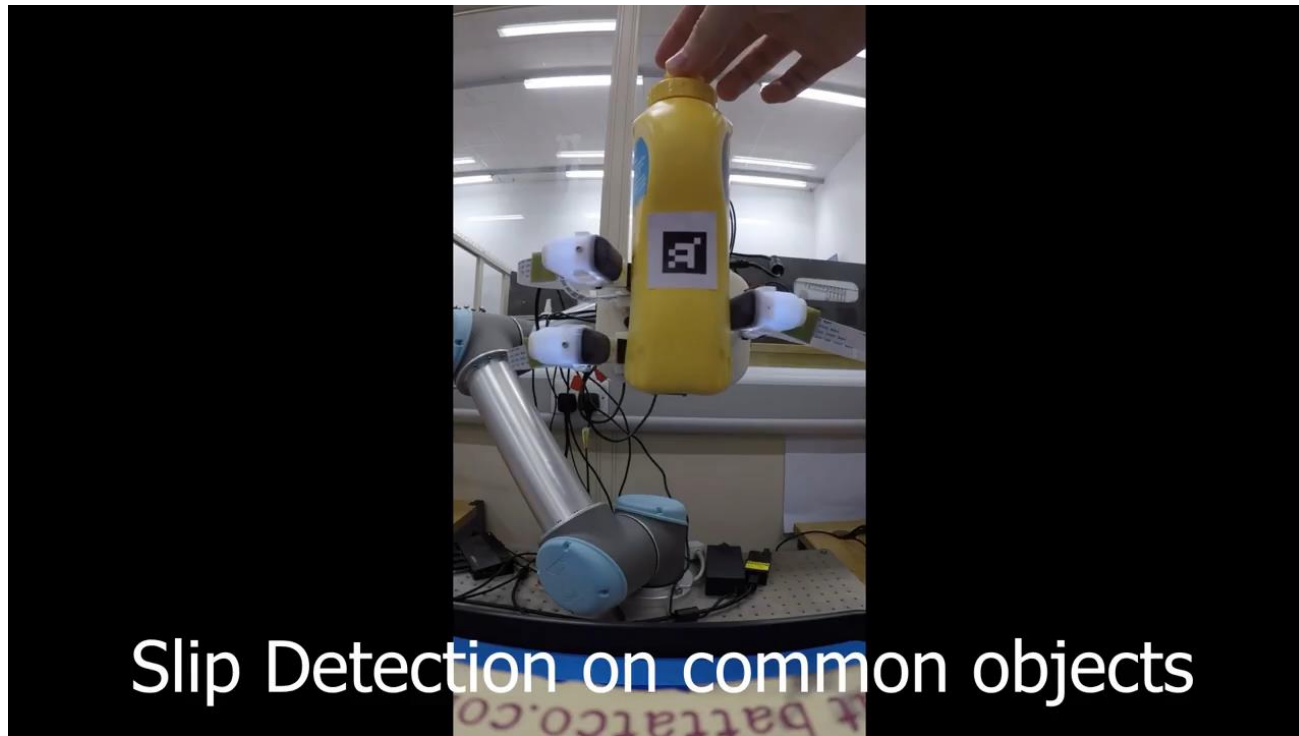
Laurence Willemet
4-1-2024

“It is comparatively easy to make computers exhibit adult performance on intelligence tests, but difficult or impossible to give them the skills of a one-year-old when it comes to perception and mobility”

Moravec



Reaction vs. prediction

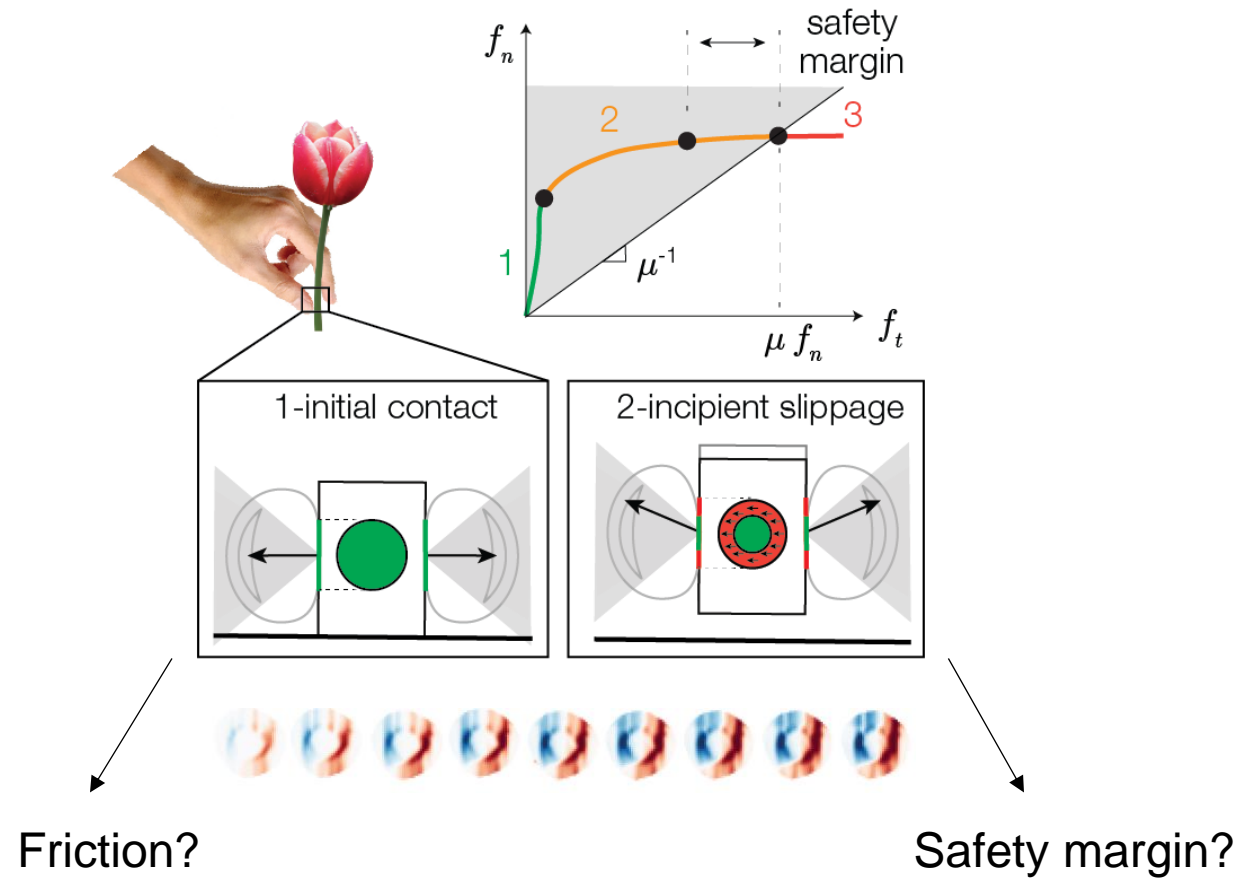


James and Lepora, 2020

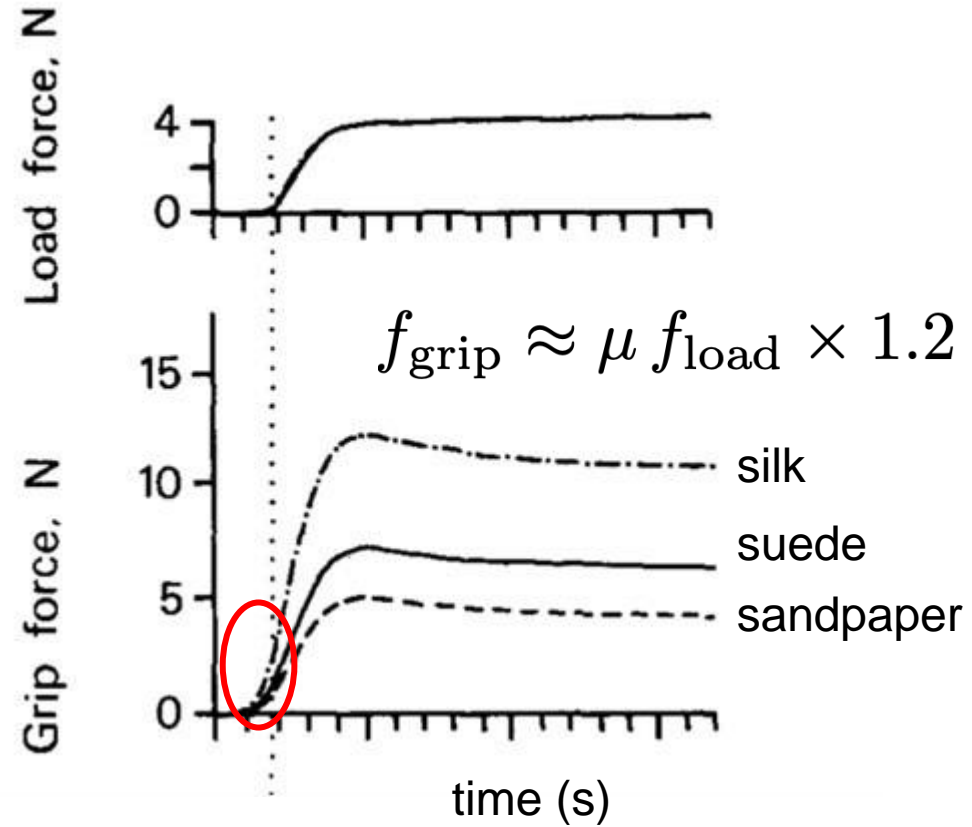
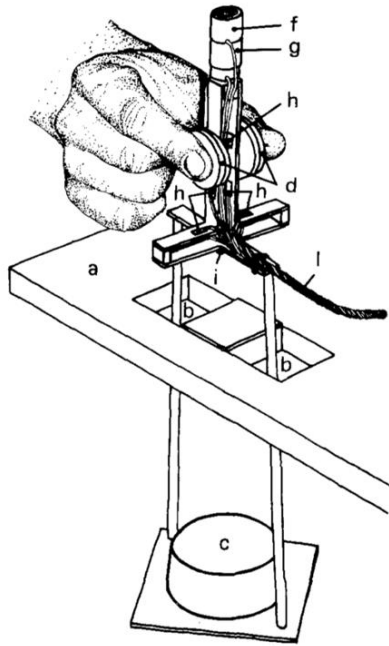
Grasping is about perceiving the interaction forces



Grip force regulation

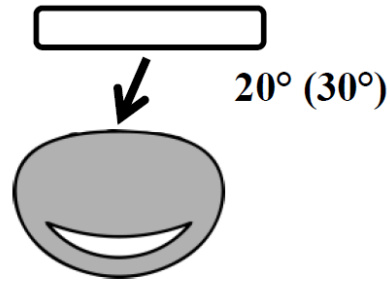
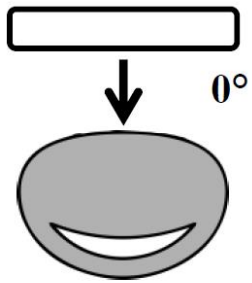


Grip force regulation

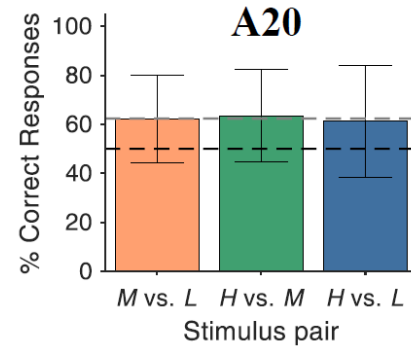
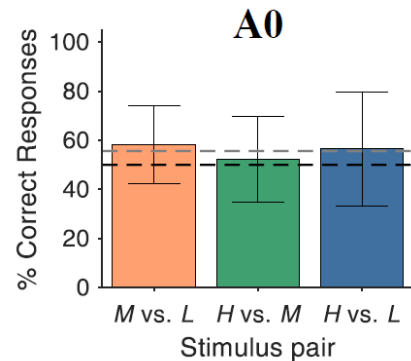


Johansson and Westling, 1984

Are we able to perceive friction on initial contact?

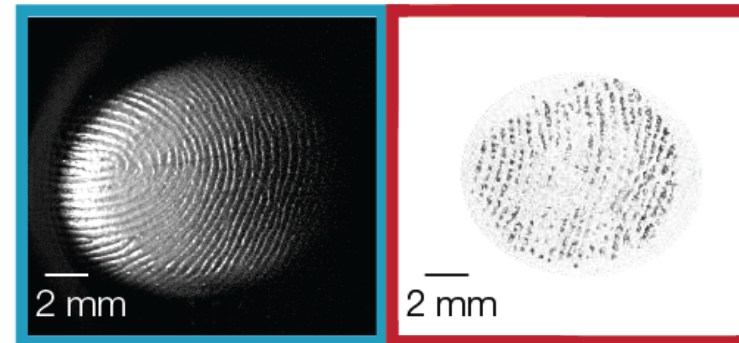
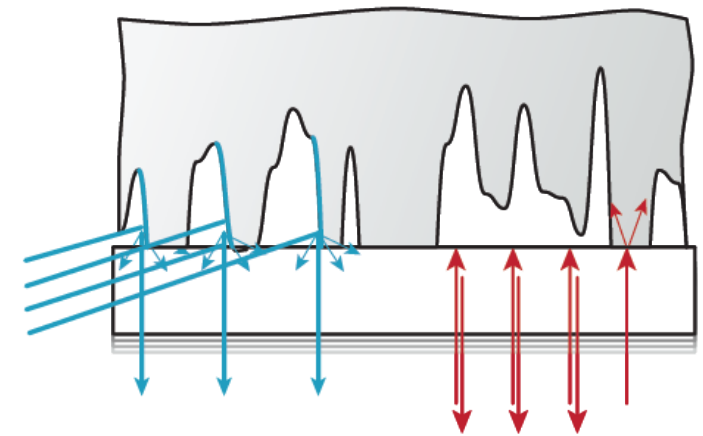
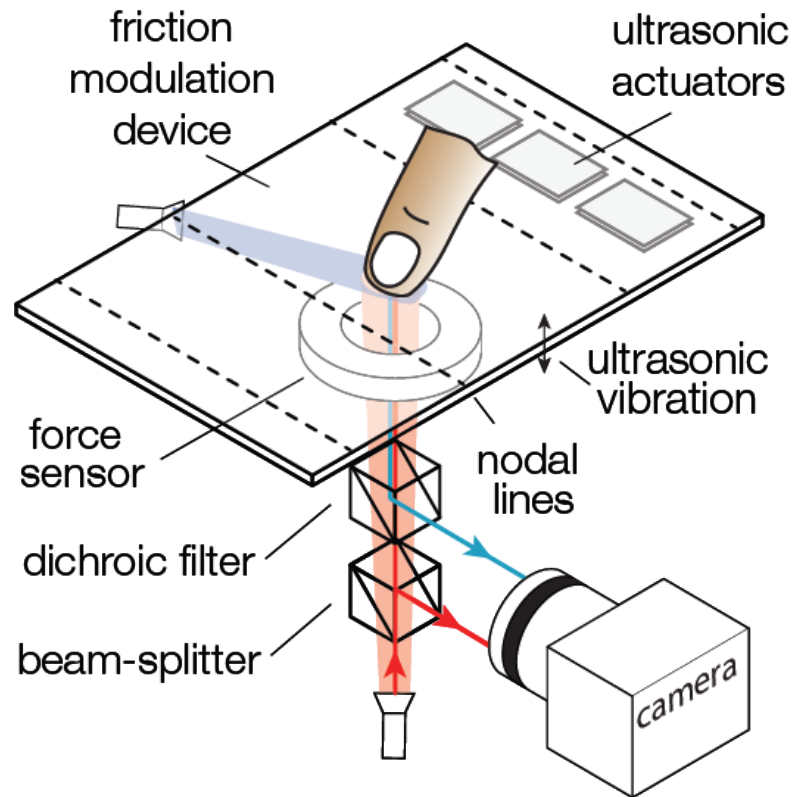


No perception when the subject is passive



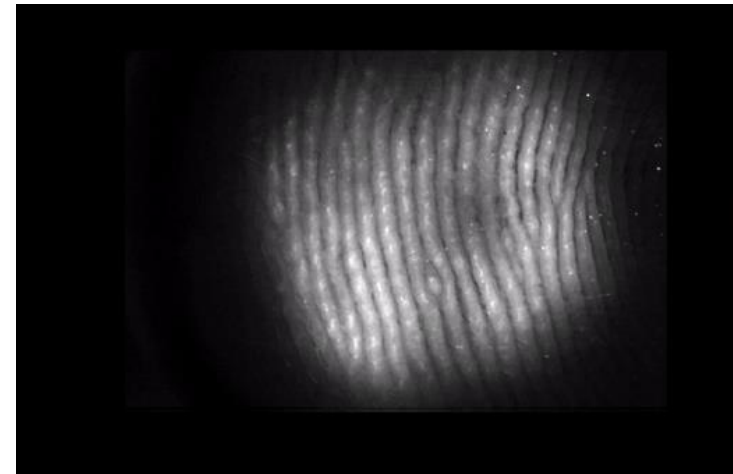
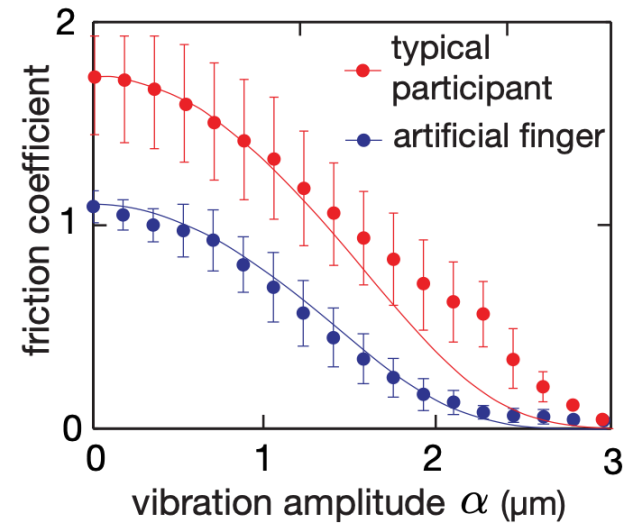
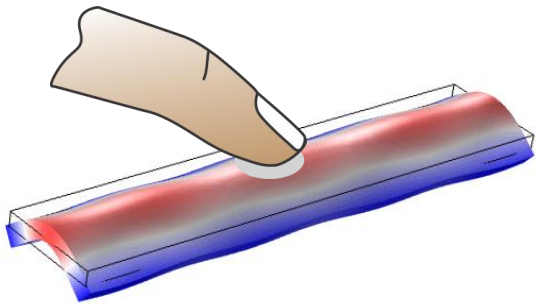
Khamis et al., 2020

Experiment in active

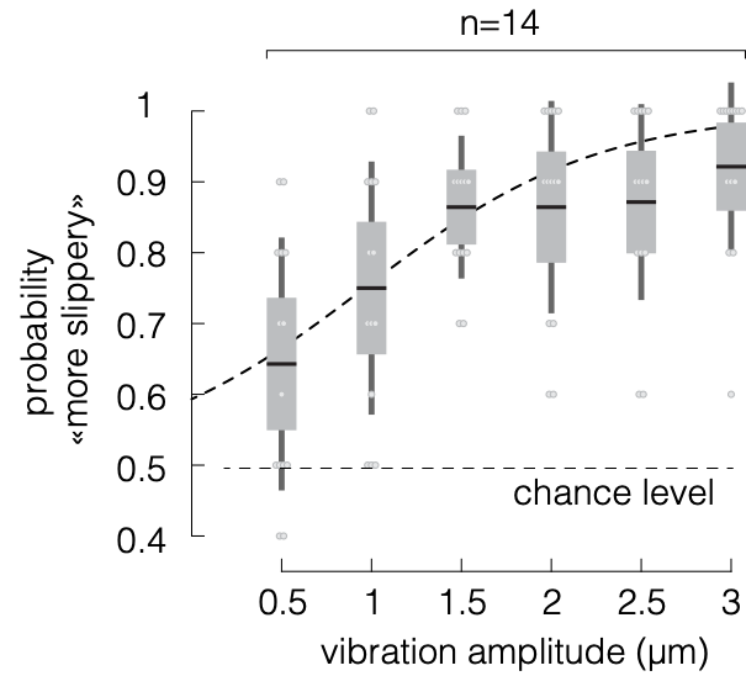
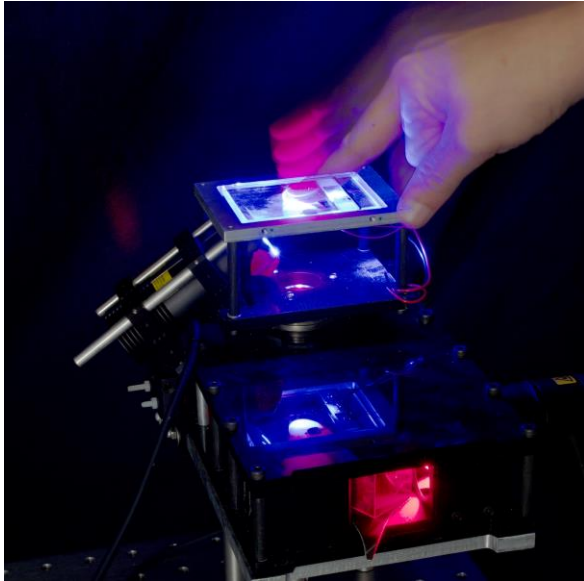


Willemet et al., Initial contact shapes the perception of friction (2021)
PNAS

Friction modulation

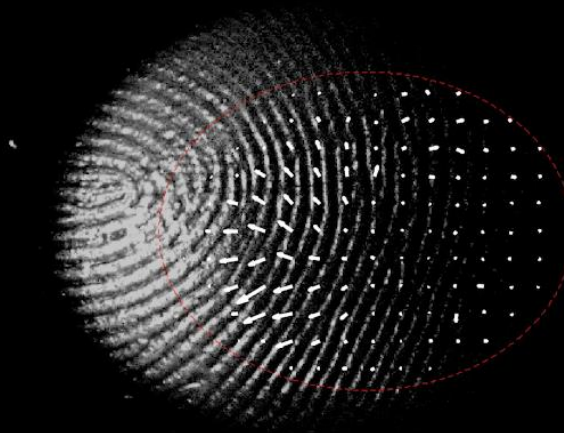


Psychophysical results

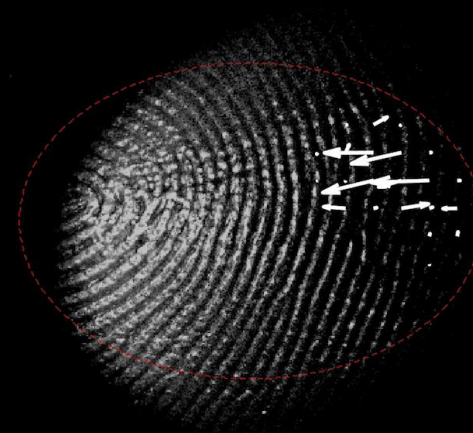
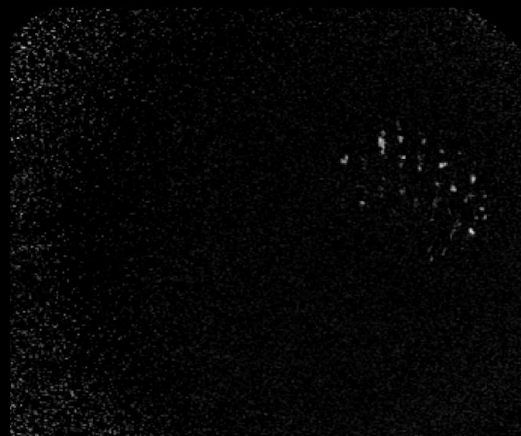


high friction

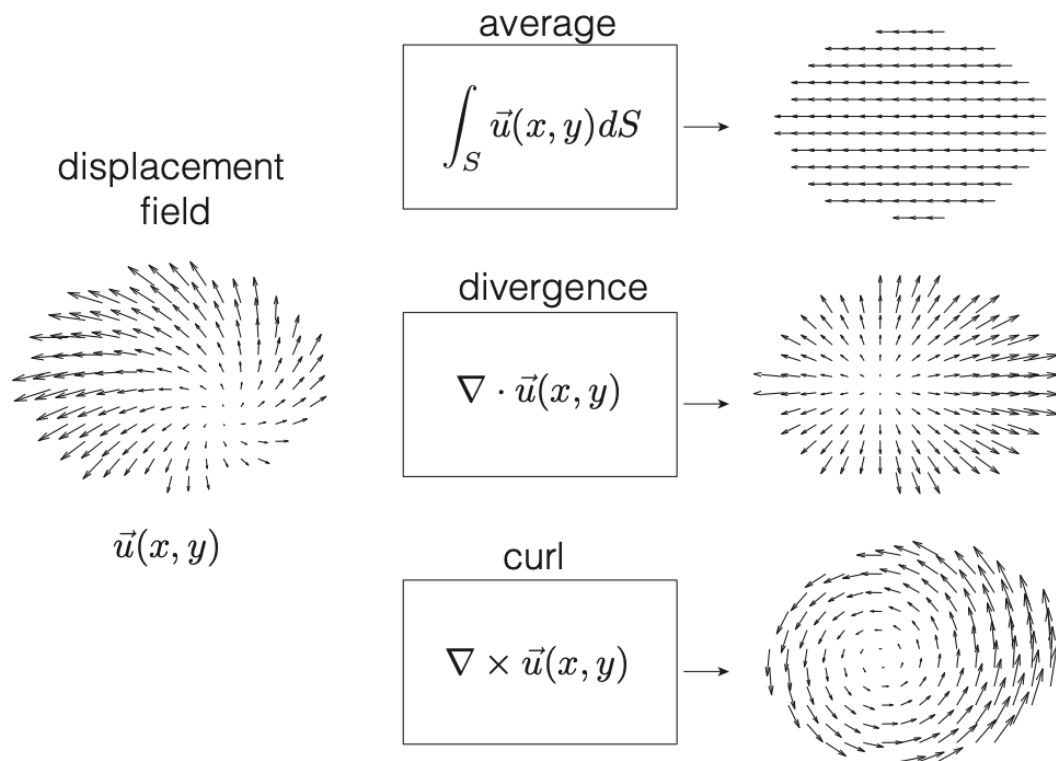
high friction



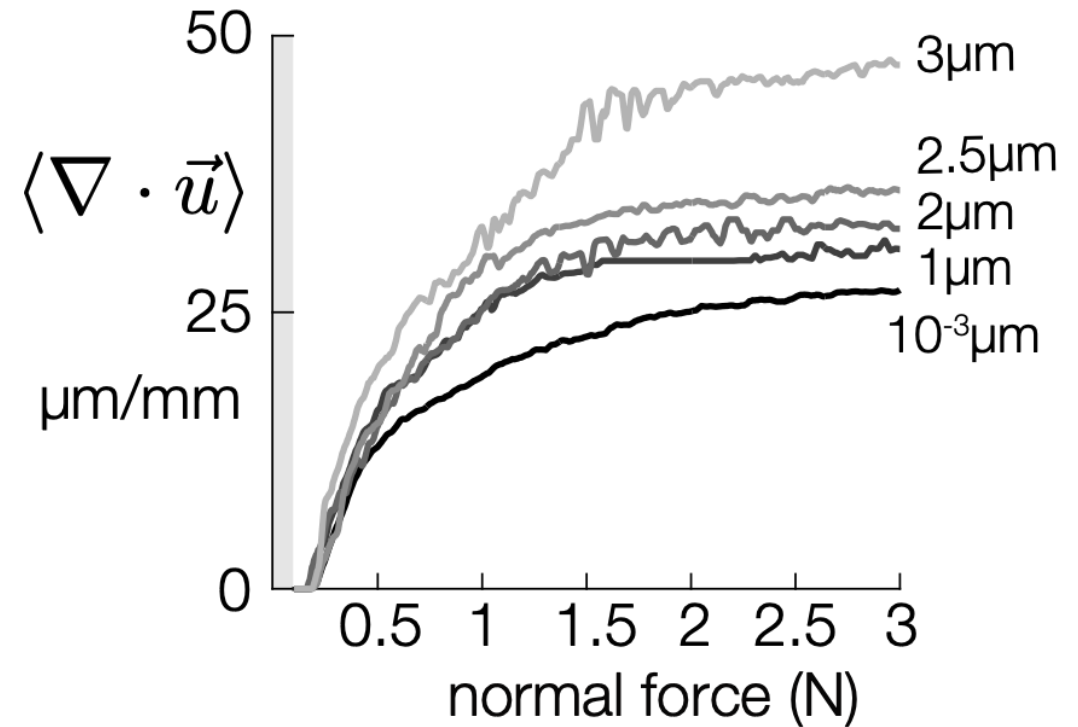
low friction



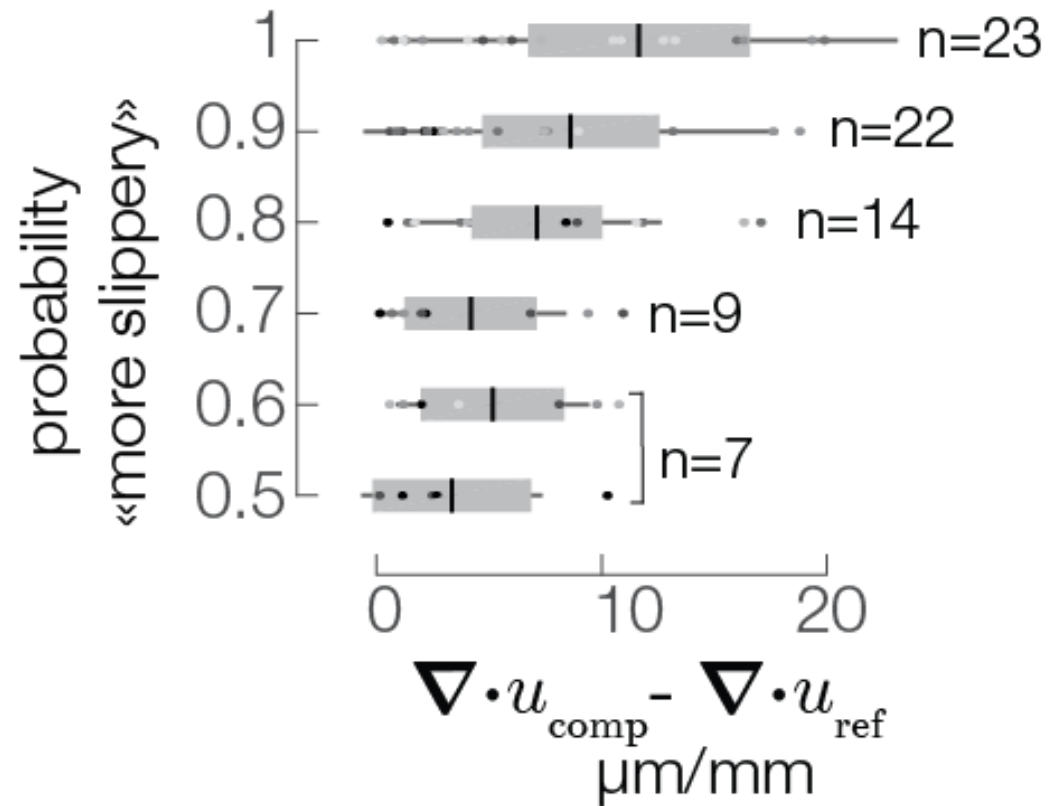
Friction and skin deformation



$$\int_S \nabla \cdot \vec{u}(x, y) dS = \int_S \frac{\partial u_x}{\partial x} + \frac{\partial u_y}{\partial y} dS$$



Skin deformation and friction perception

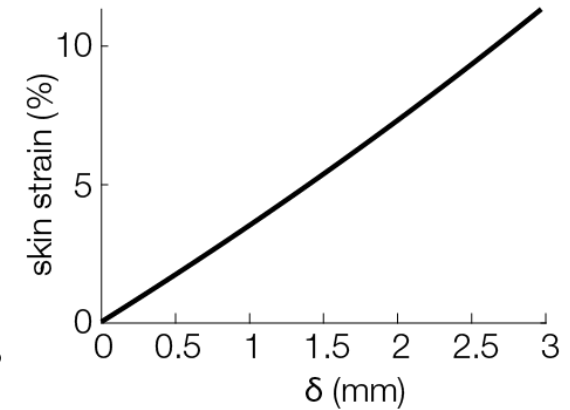
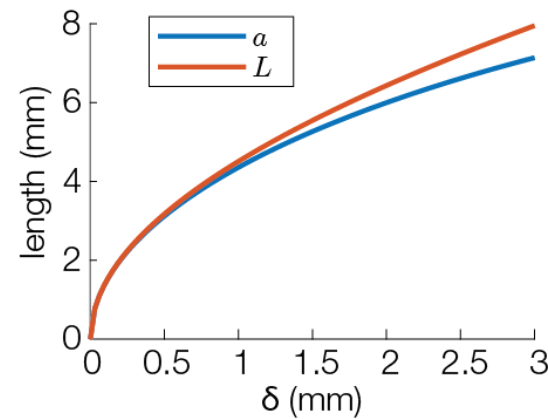
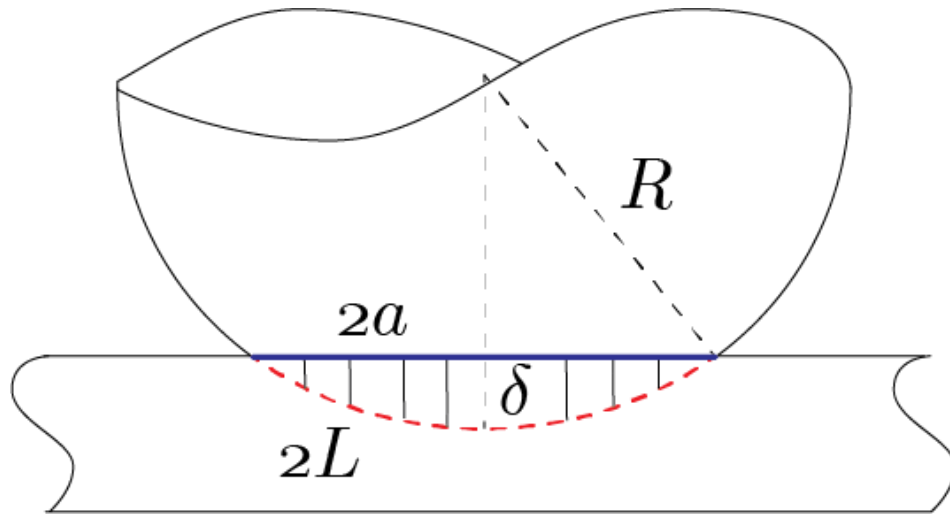


Spearman's rank coefficient=0.28,
p=0.009

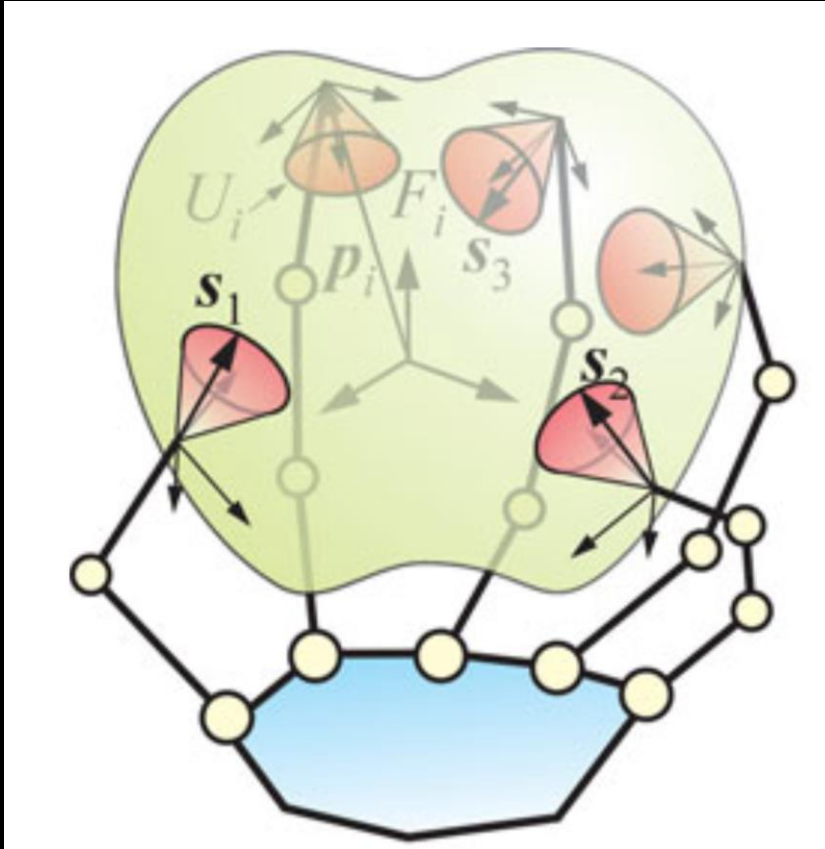
Where does this lateral strain comes from?

$$L = R \cos^{-1} \left(\frac{R - \delta}{R} \right)$$

$$a^2 = R^2 - (R - \delta)^2$$



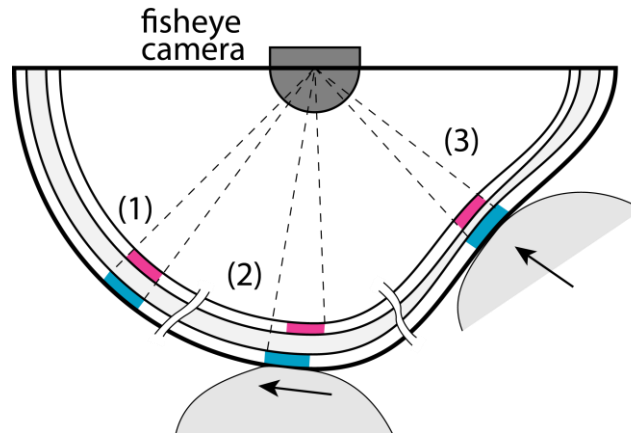
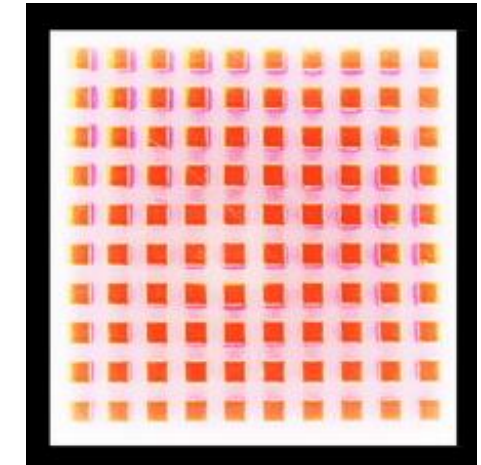
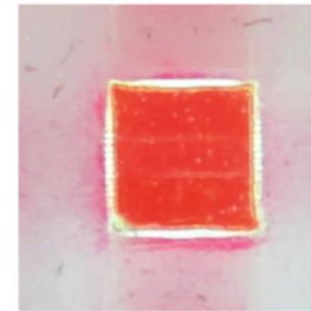
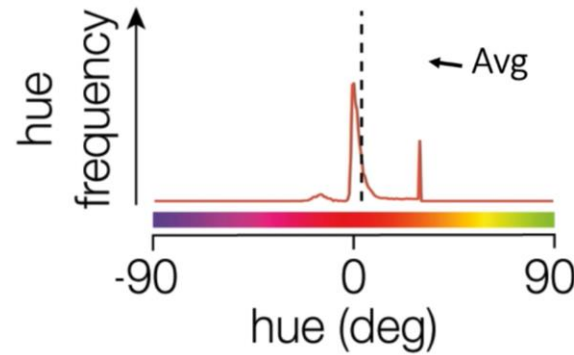
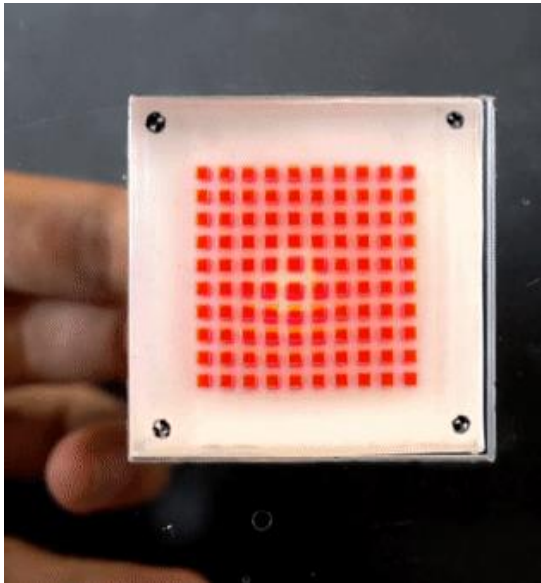
Friction perception is possible on initial contact



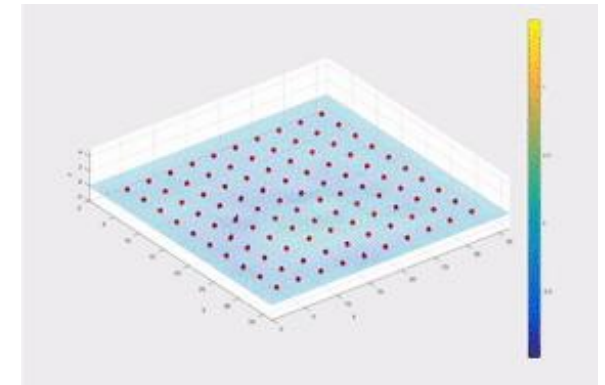
Can robots perceive this lateral expansion?

Tactile sensor: transduction principle

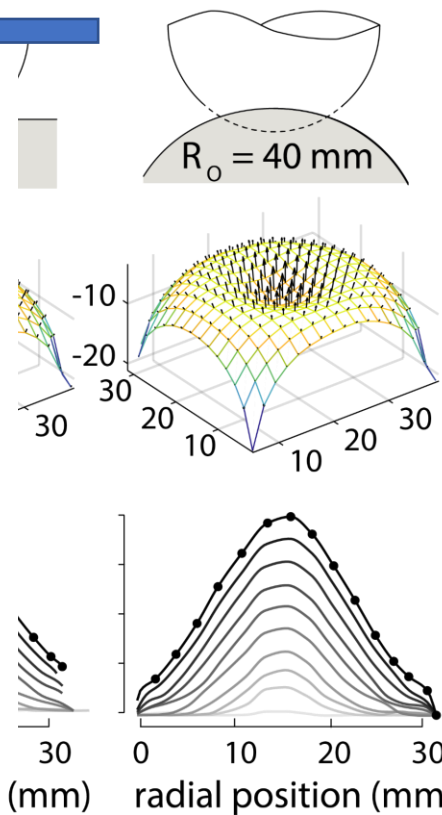
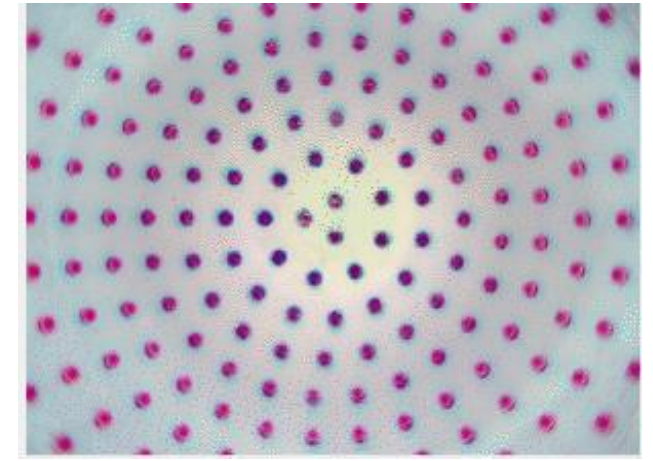
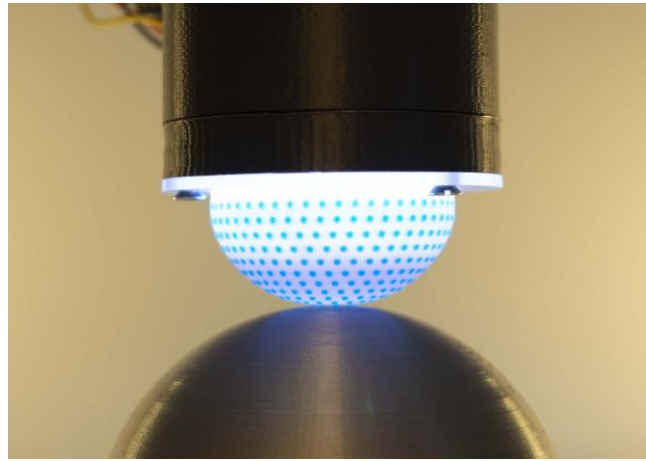
Histogram of one single marker



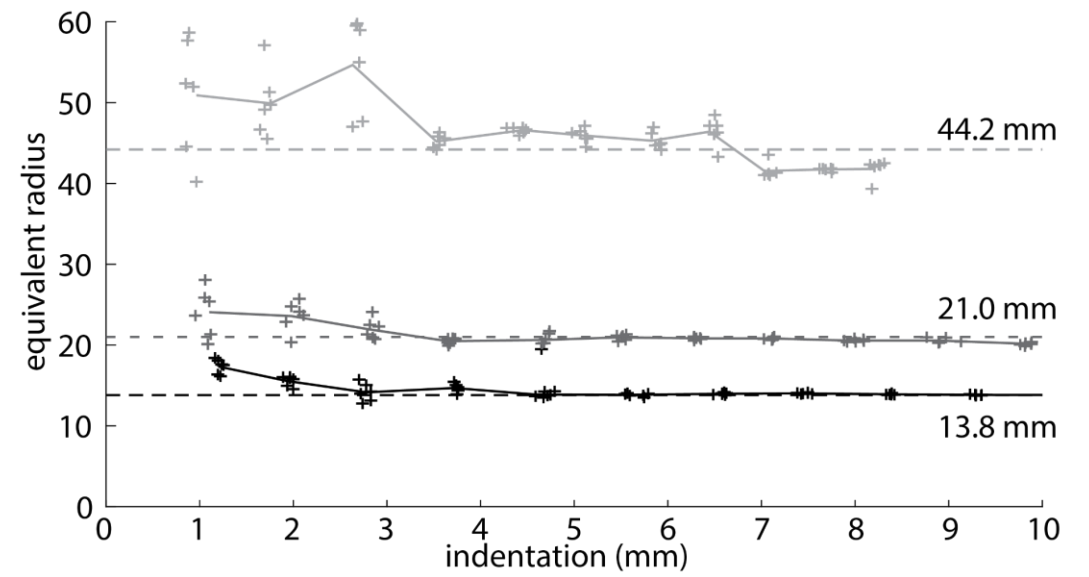
- (1) 
- (2) 
- (3) 



Curvature estimation

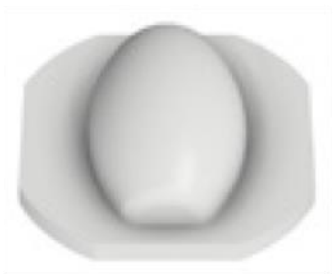


Hertz theory: $R_{eq} = \frac{a^2}{\delta_r}$

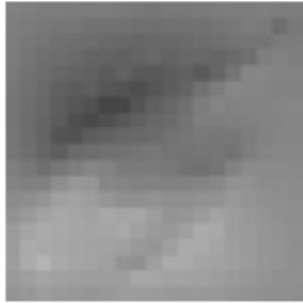


Shape reconstruction

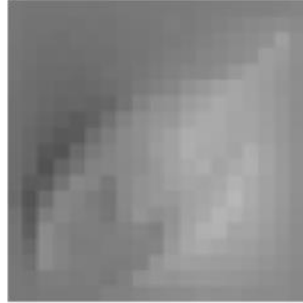
(a) indenter



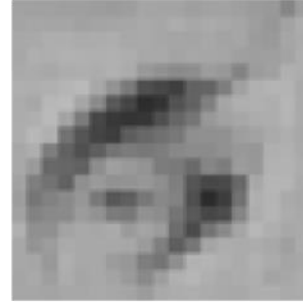
dx



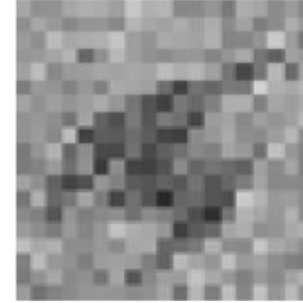
dy



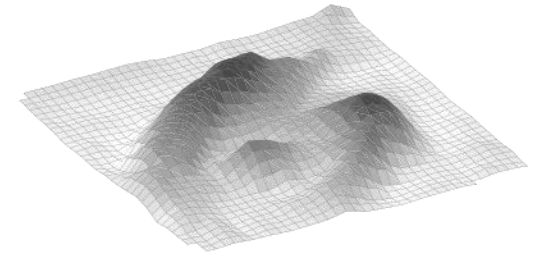
dz



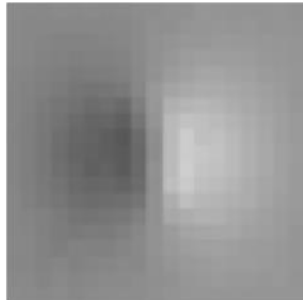
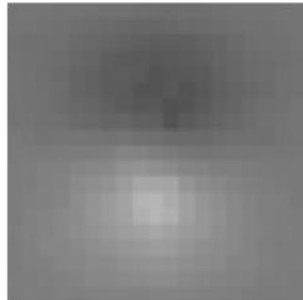
dz



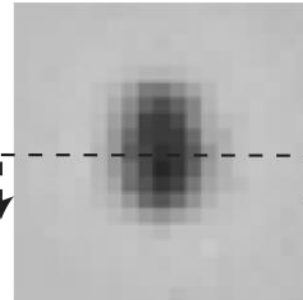
3d map



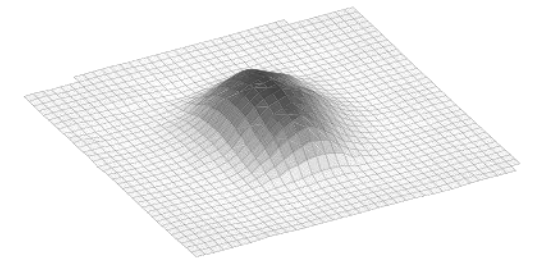
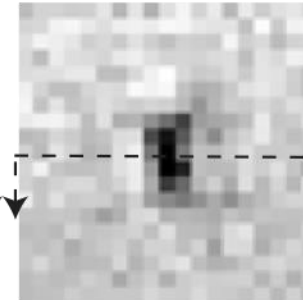
marker tracking



CNN



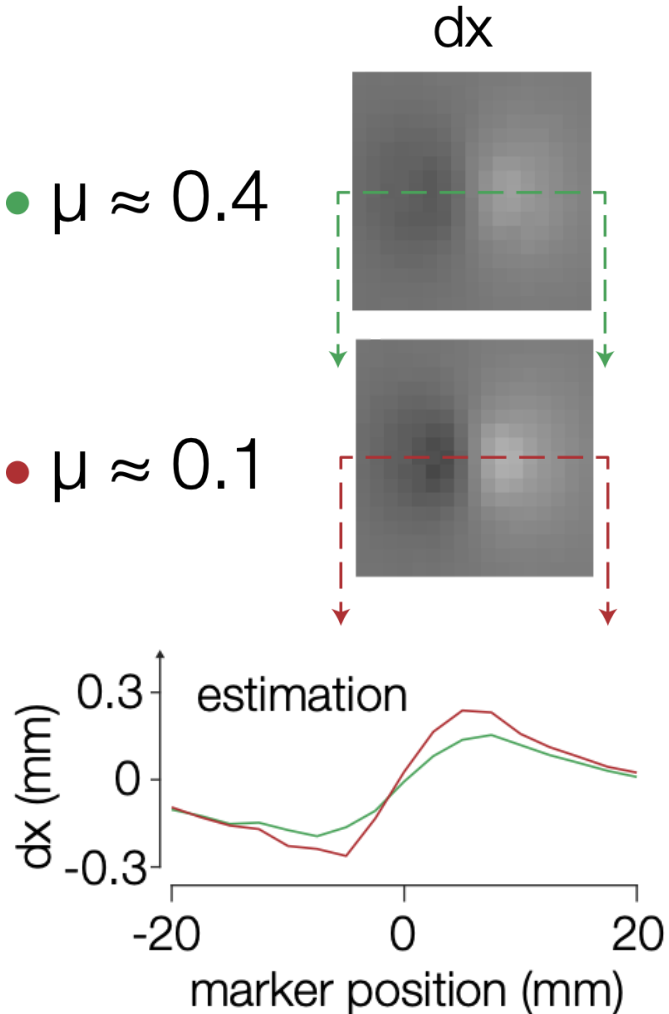
hue



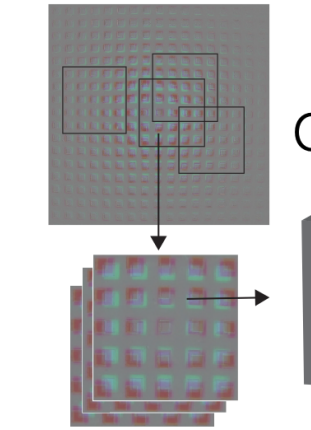
Friction perception

- $\mu \approx 0.4$

- $\mu \approx 0.1$

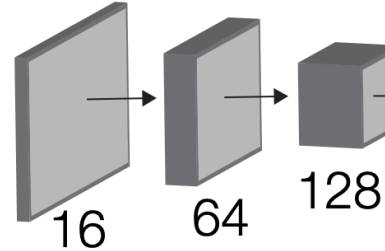


Subsampling

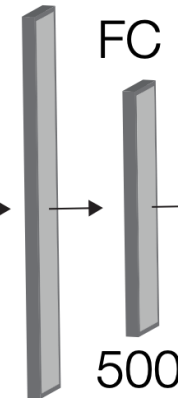


Input images
(5x5 markers)

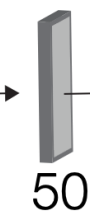
Conv+MaxPooling



Concatenate



FC



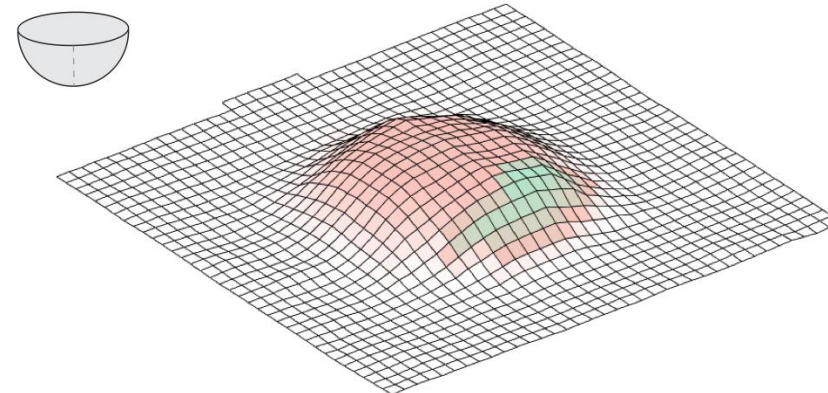
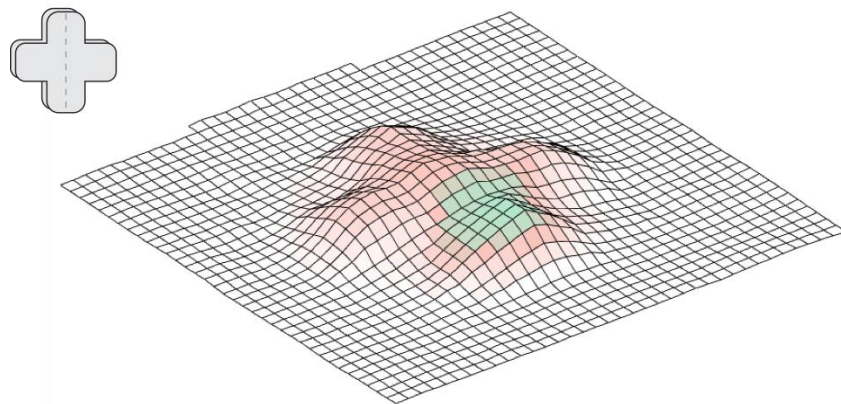
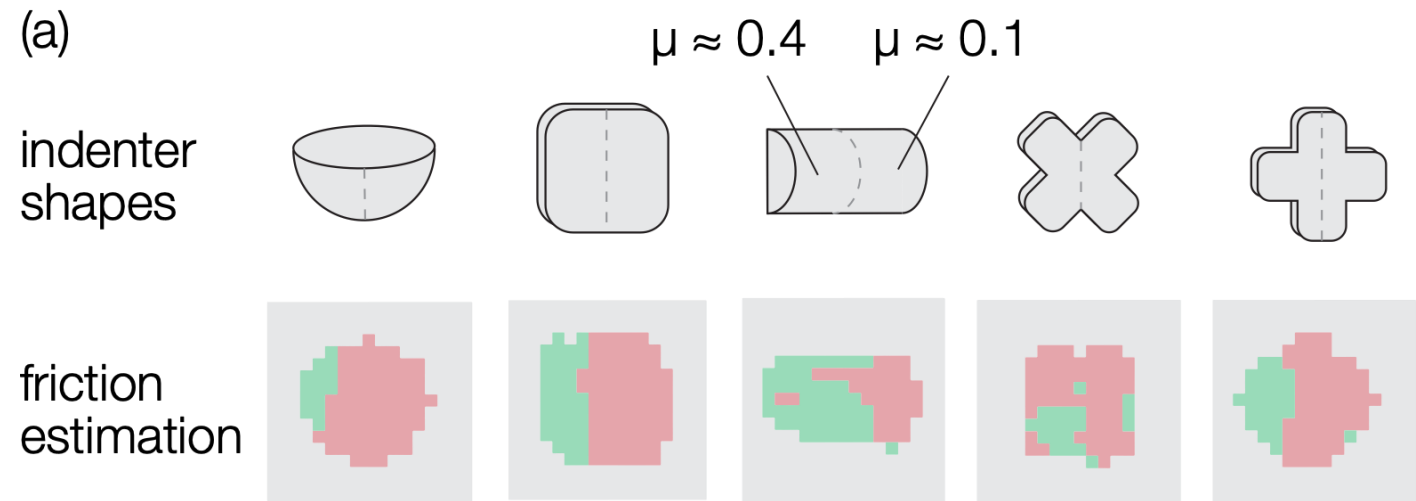
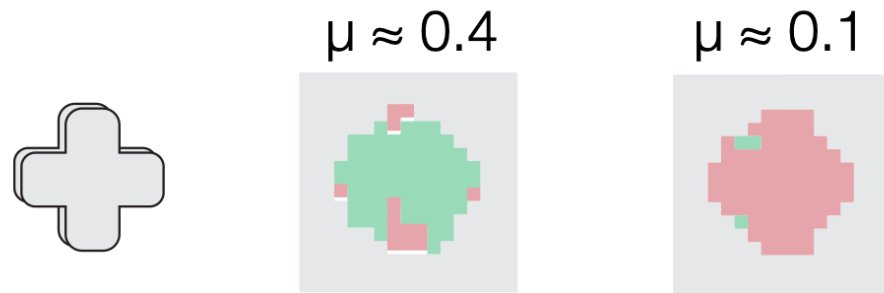
Classification
Softmax

$\mu = 0.4$
 $\mu = 0.1$
no contact

Friction map
Reconstruction



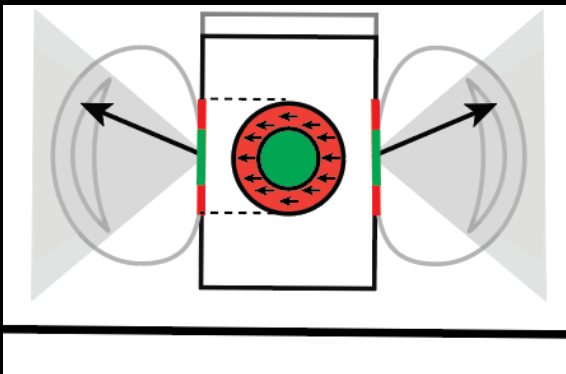
Friction perception



● Area with high friction

● Area with low friction

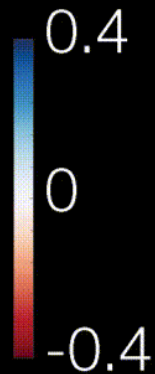
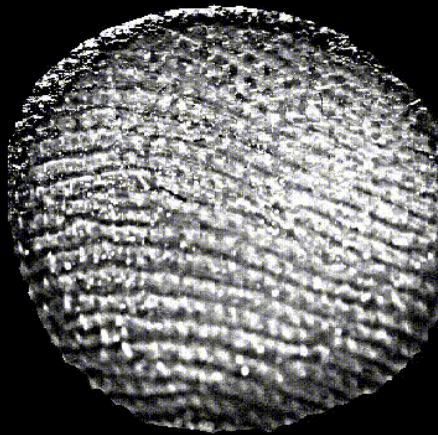
Grip force is continuously adjusted to keep a 20% safety margin



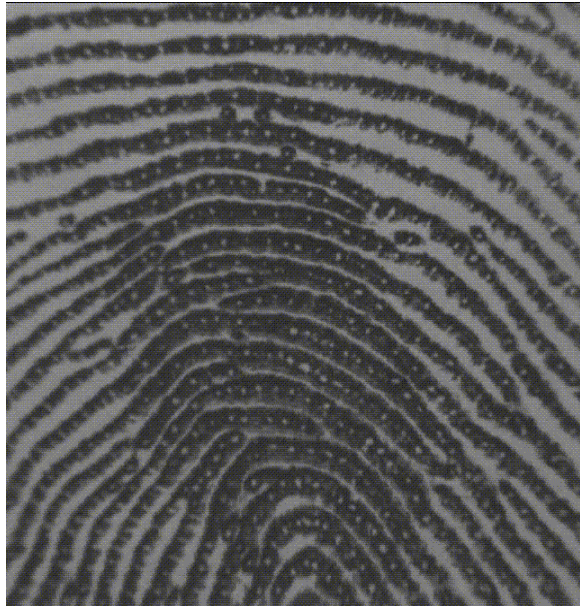
Skin deformation during incipient slippage

wet cherry
= high friction

dry cherry
= low friction



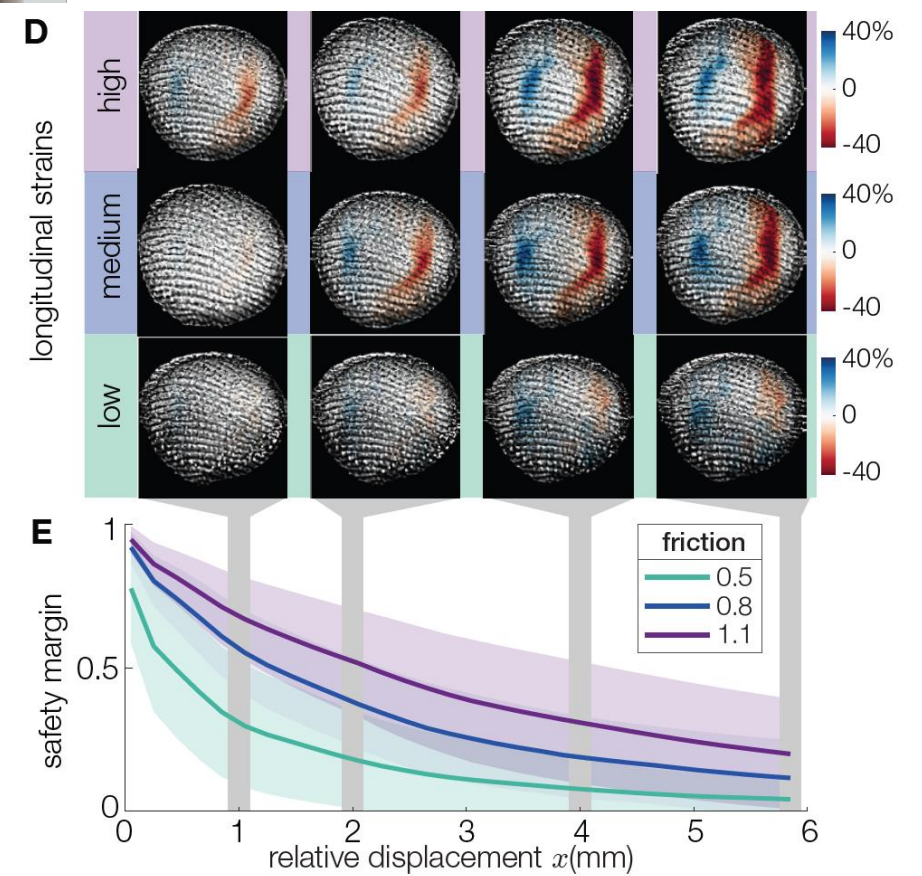
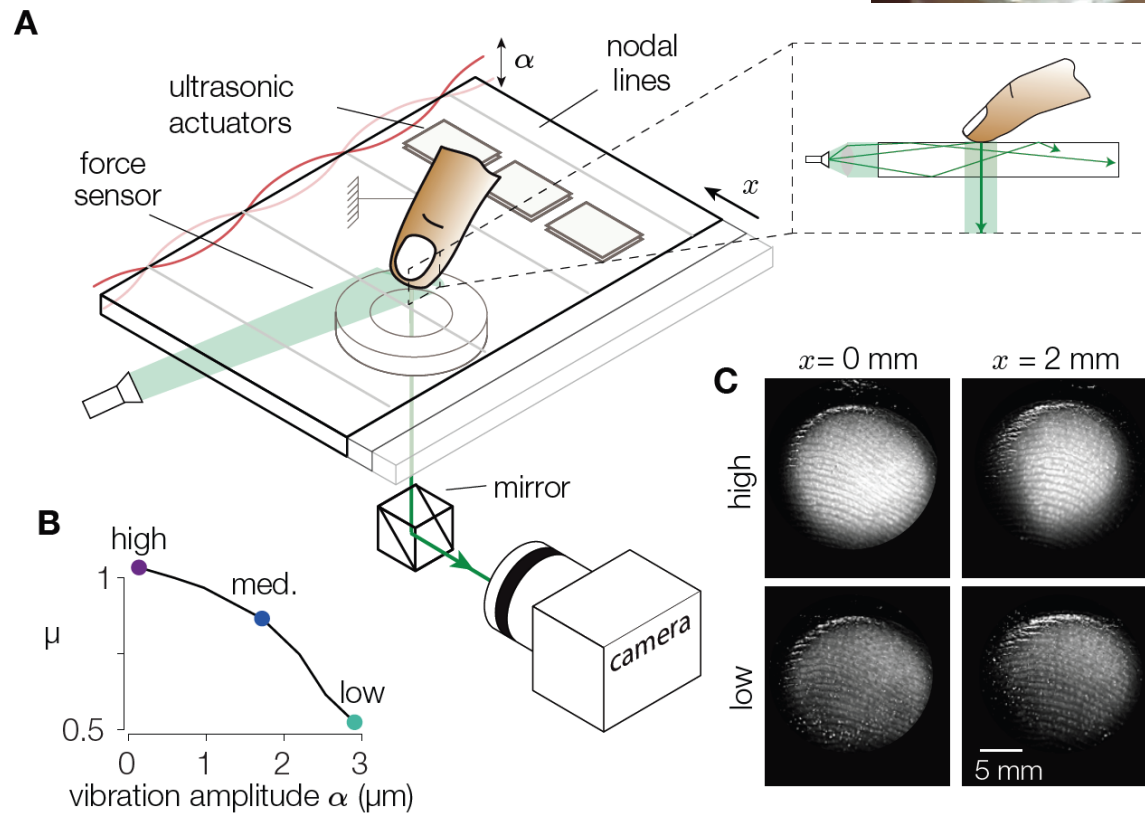
Finger slippage



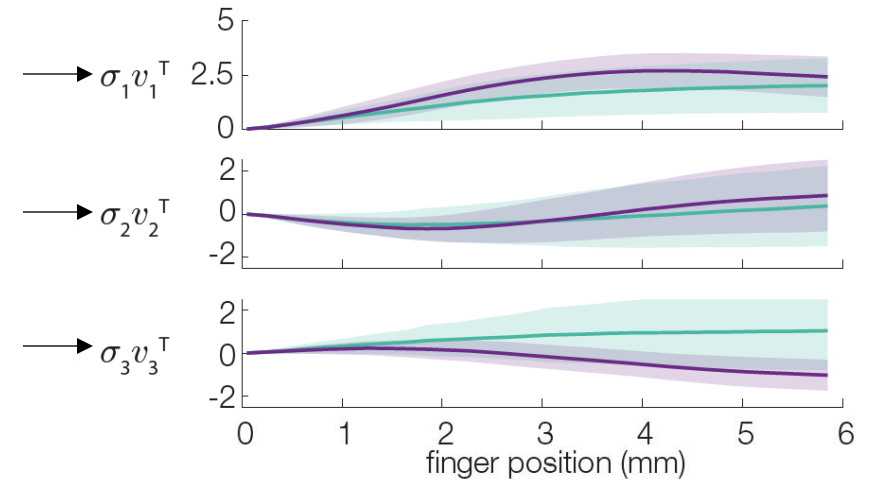
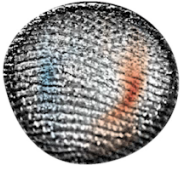
high friction

low friction

Setup



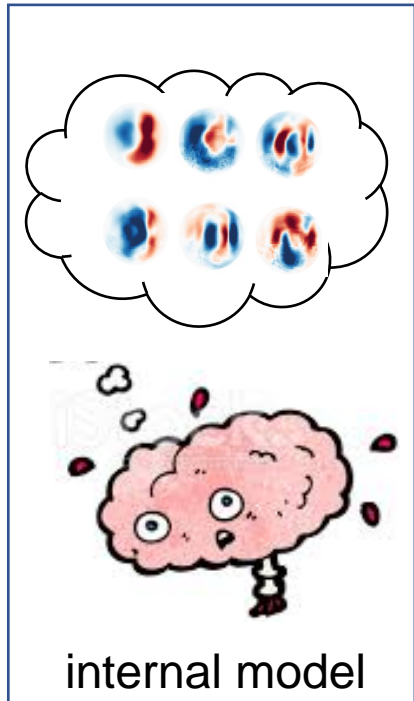
Dimensionality reduction



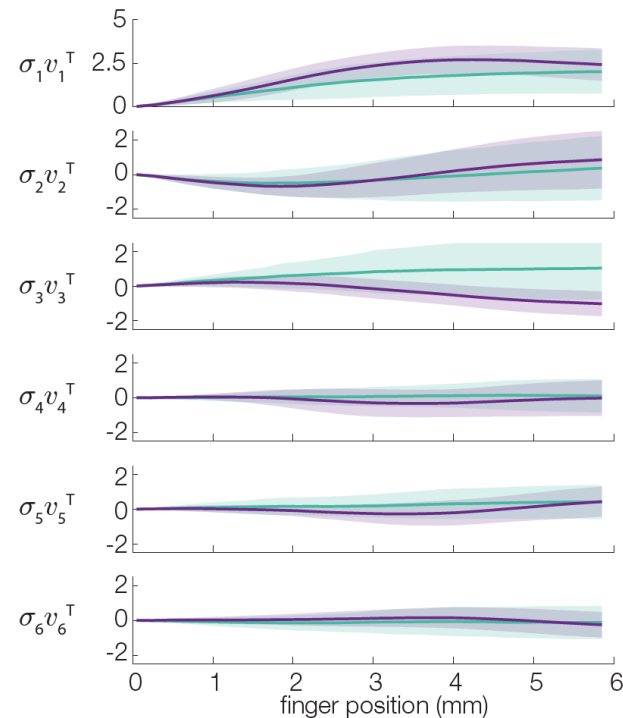
$$\hat{\epsilon}(x, t) = \sum_{i=1}^r u_i(x) \sigma_i v_i(t)$$

26

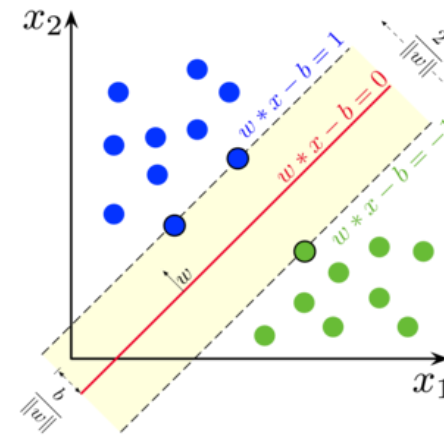
Safety margin estimation



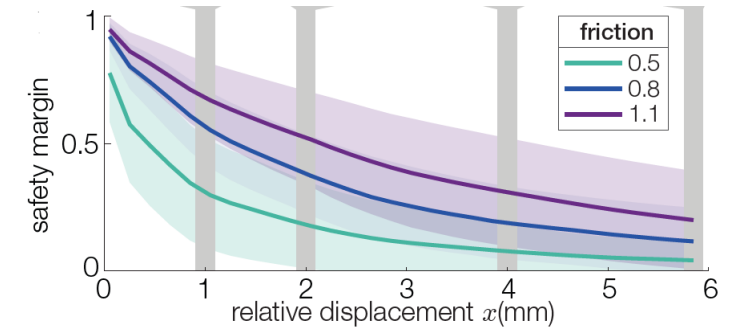
Contribution of each bases
= temporal evolution σv^T



Support Vector
Machine

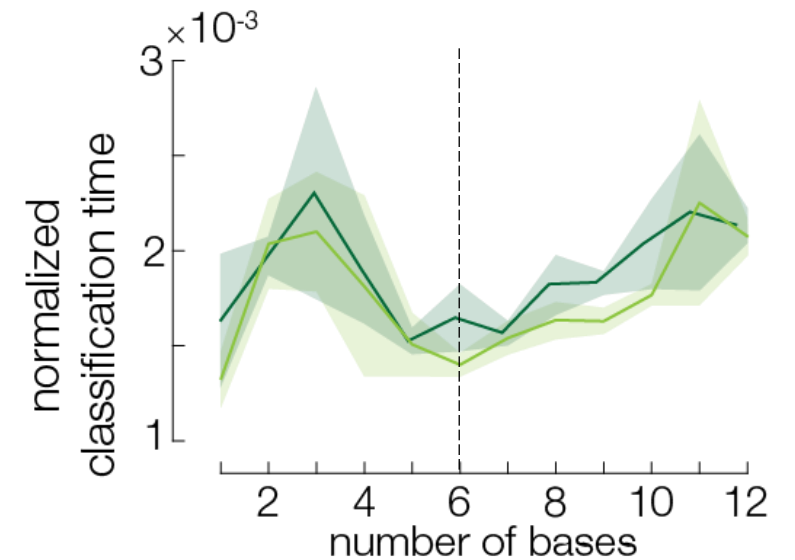
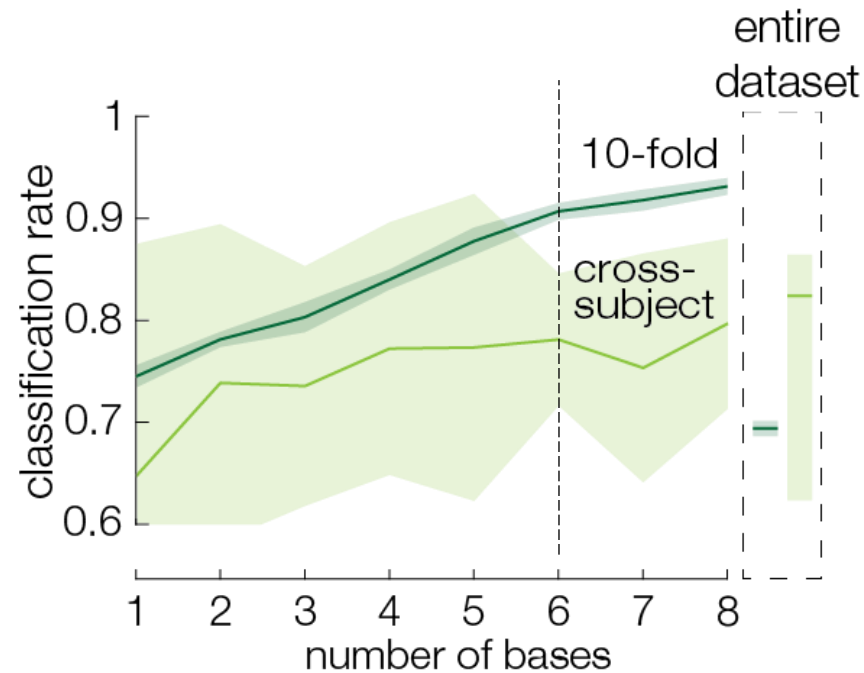
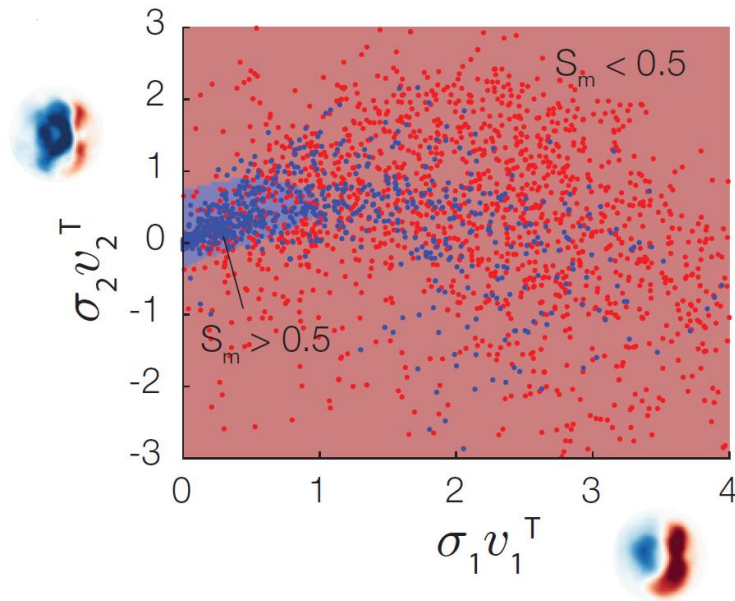


Safety margin

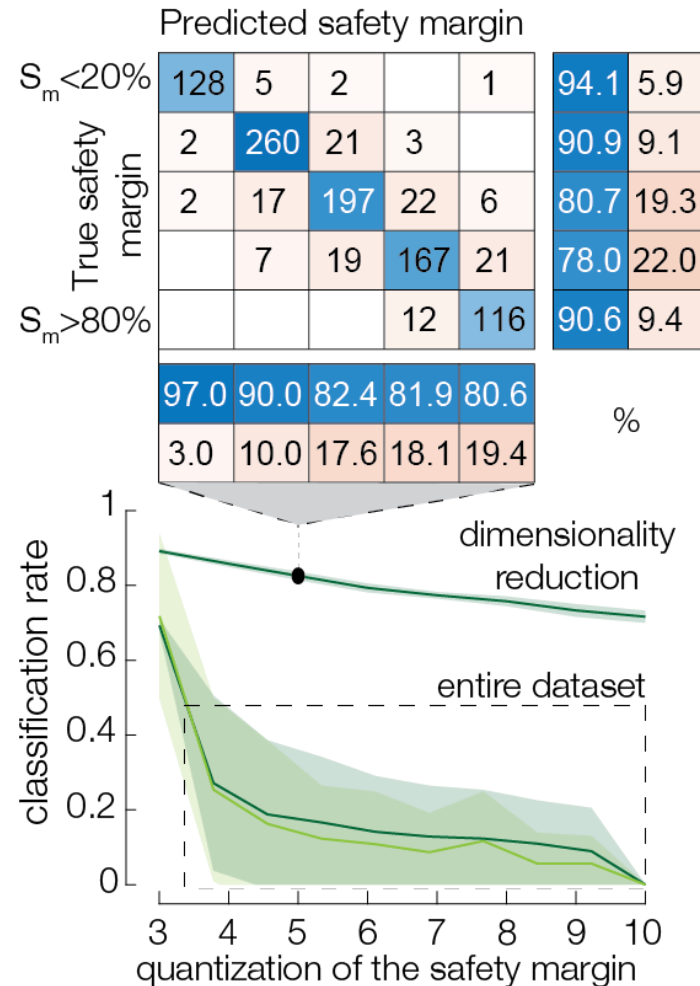


How to choose the optimal number of bases?

2 bases



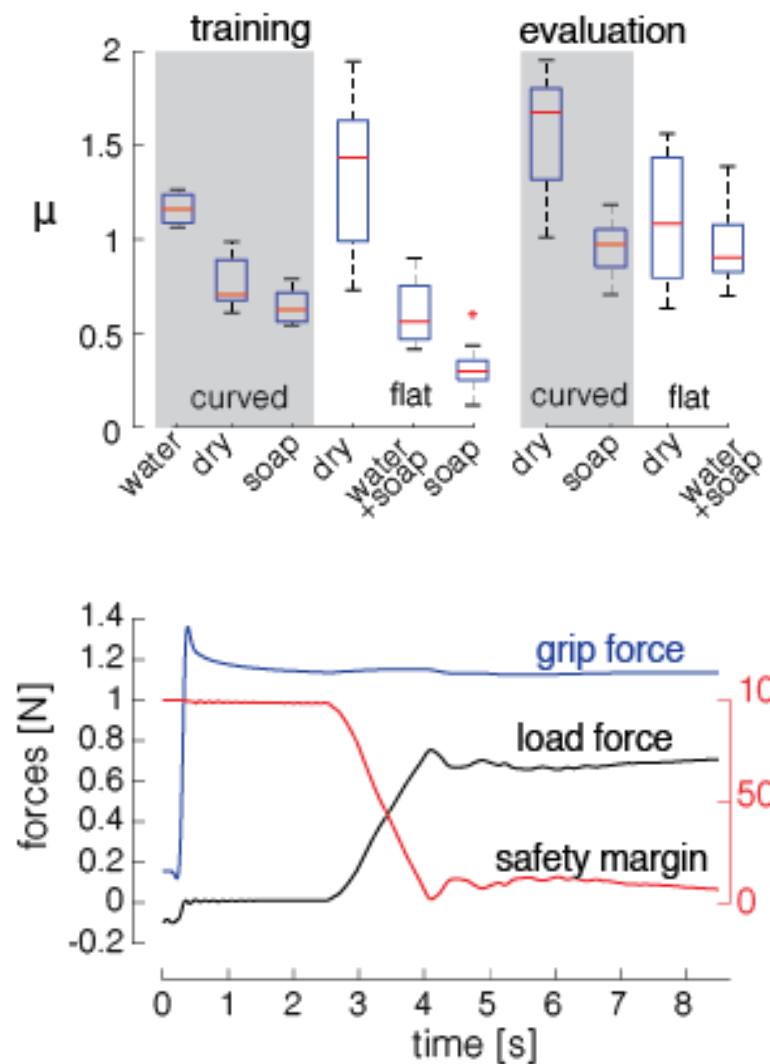
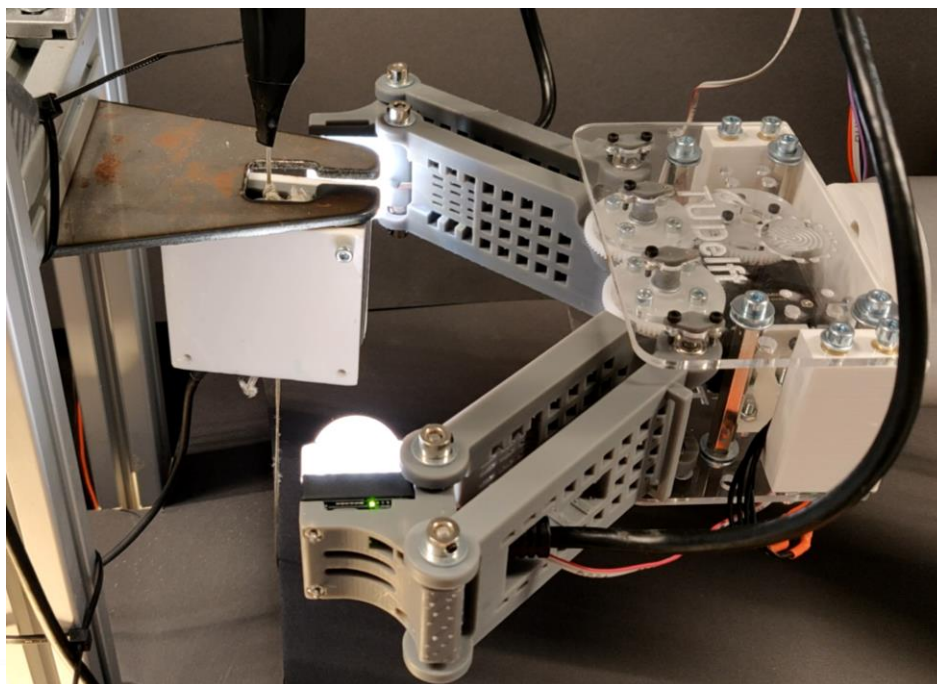
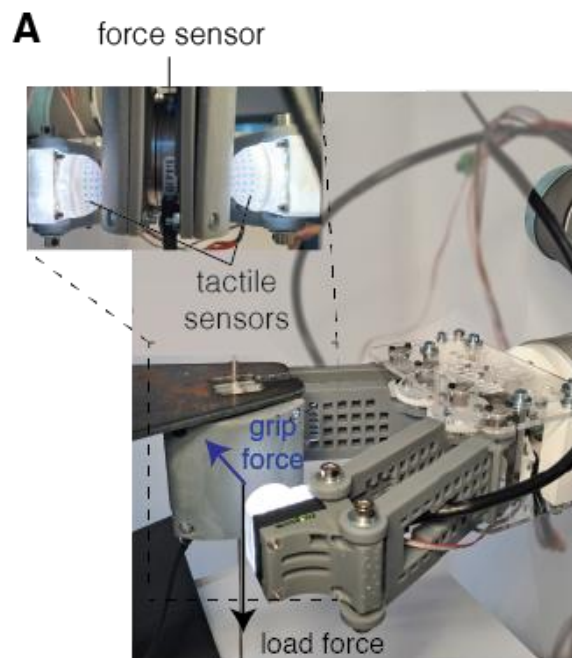
Refining the accuracy of the estimation



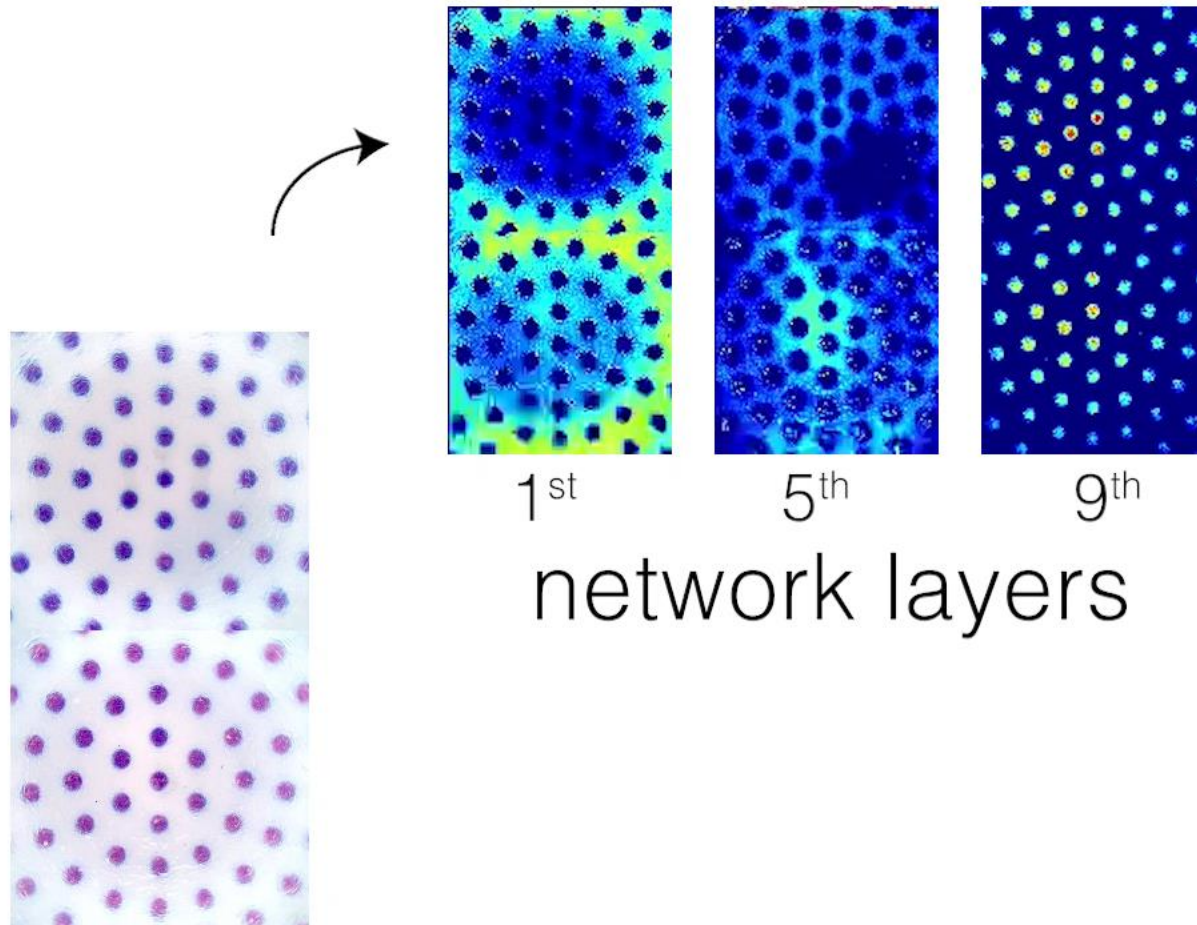
...for control in robotics



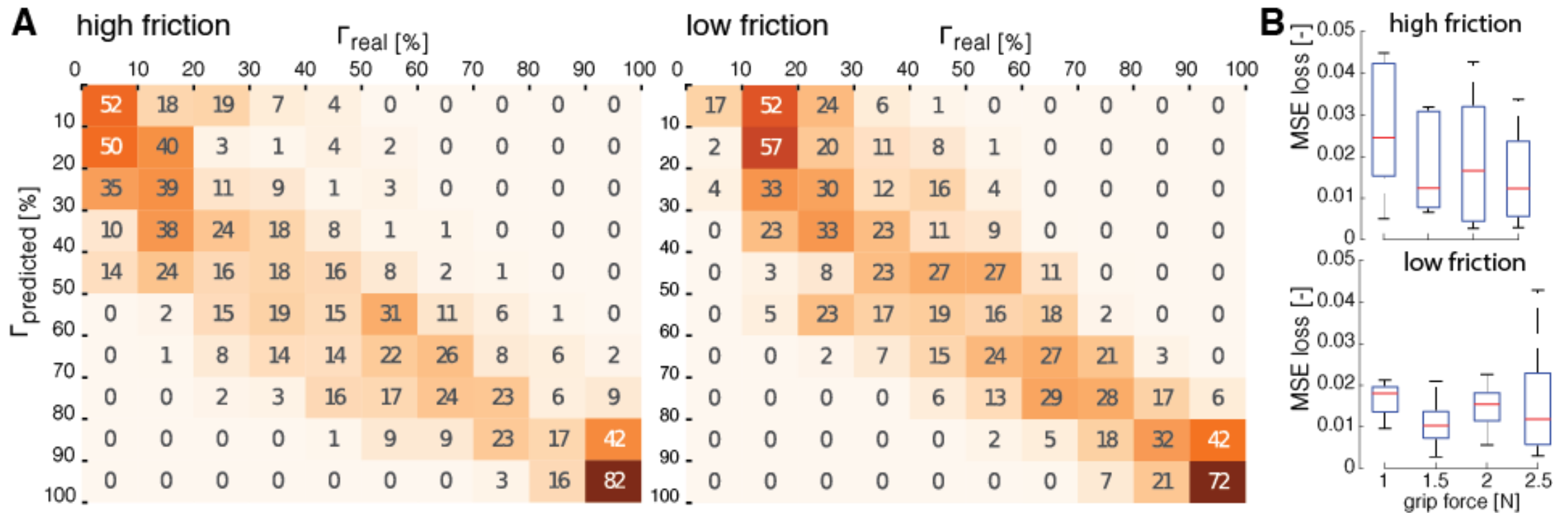
Data acquisition



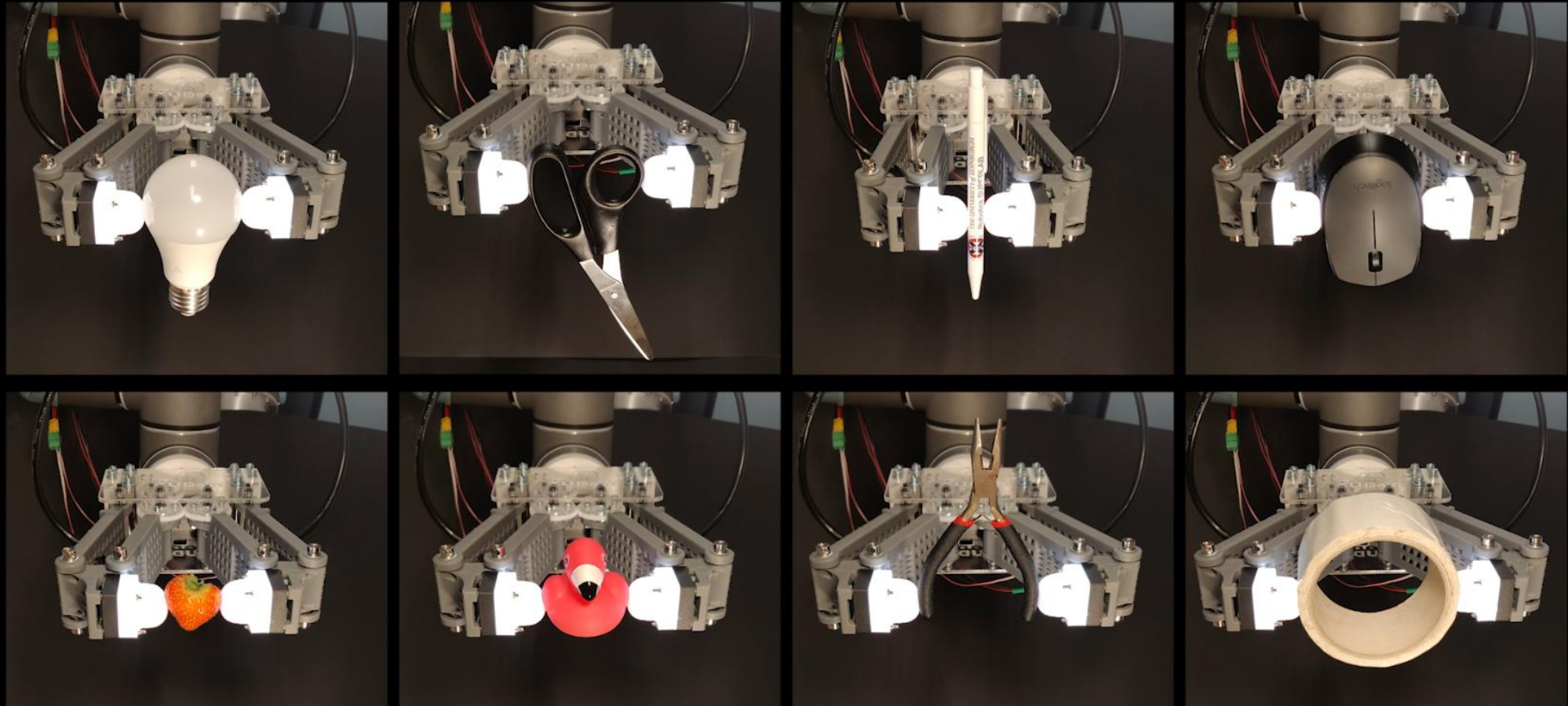
Safety margin prediction in robotics



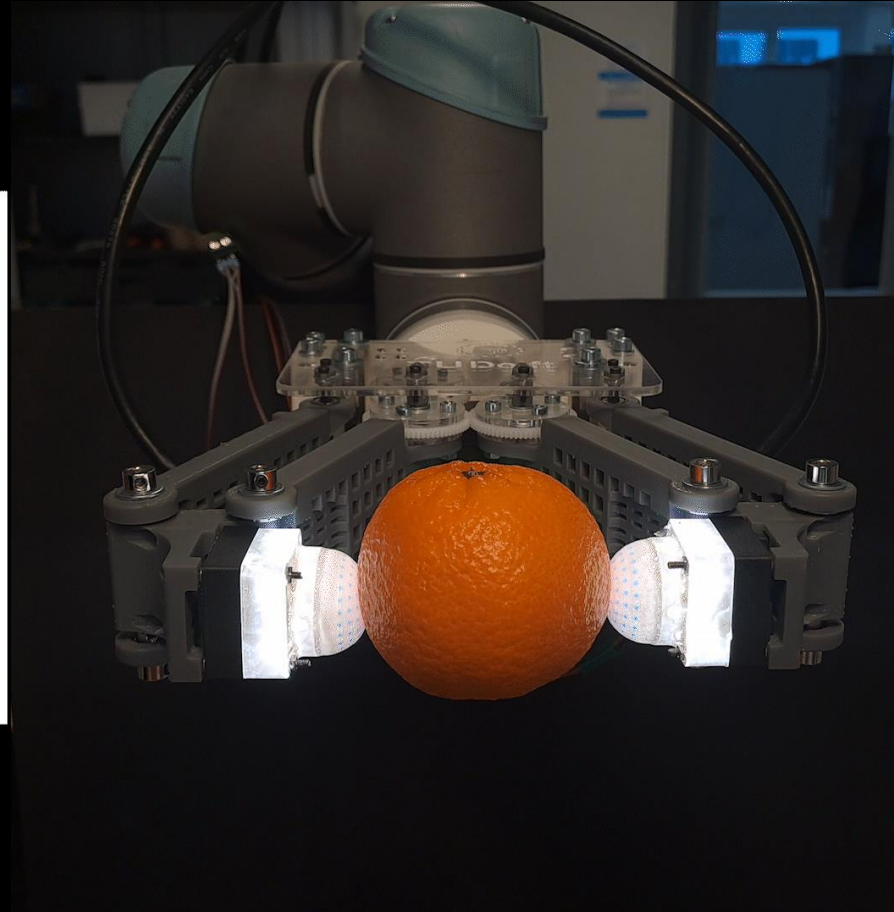
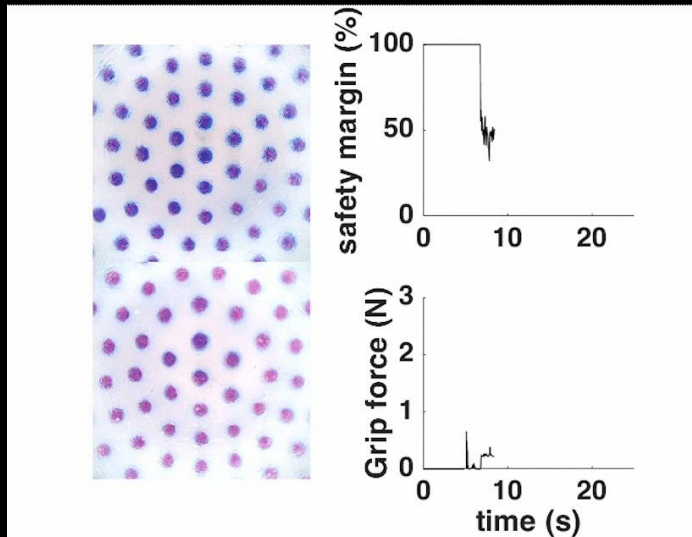
Safety margin estimation



Grip force adaptation during grasping

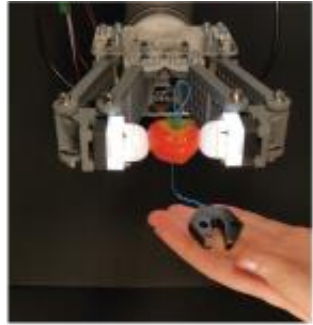
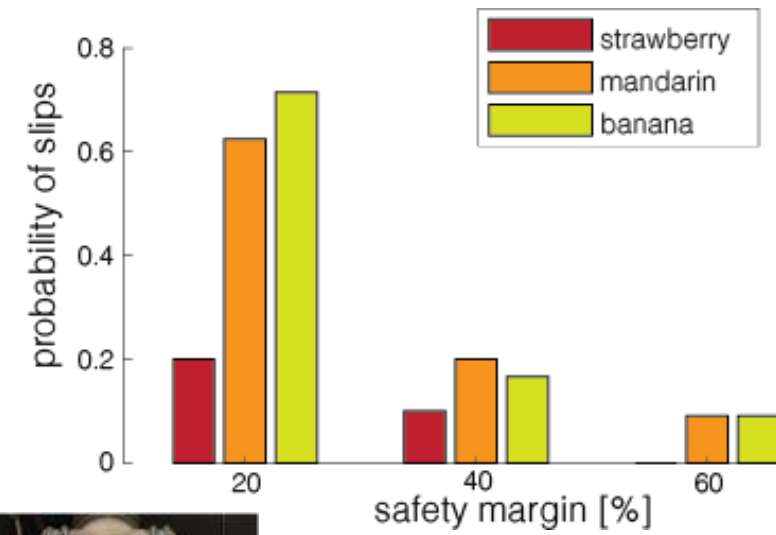


Reacting to external perturbations

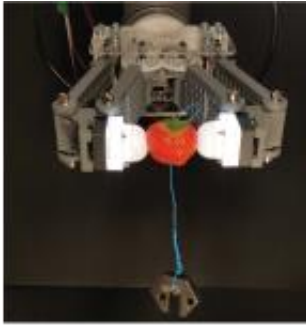


Reacting to external perturbations

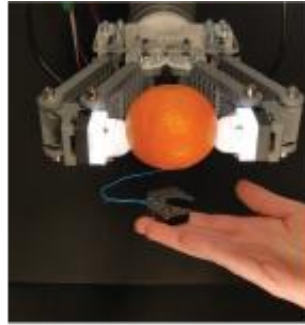
Grip force control



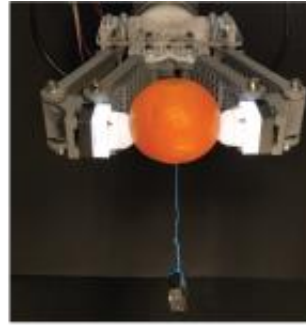
before weight drop



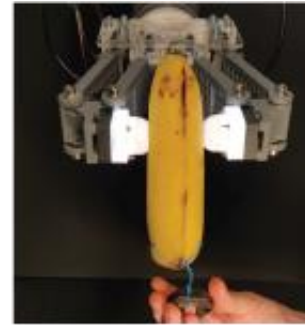
after weight drop



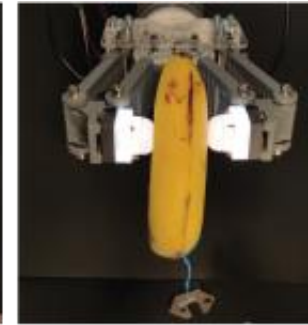
before weight drop



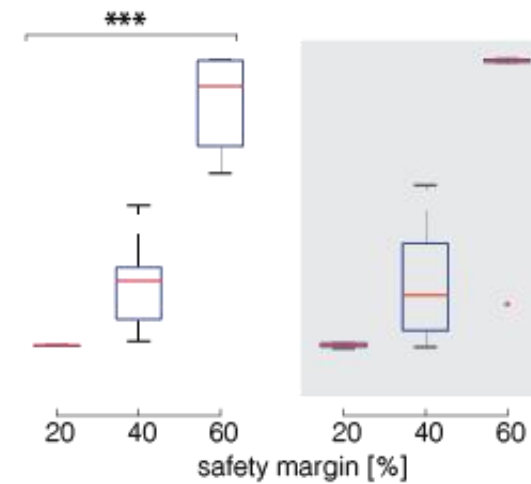
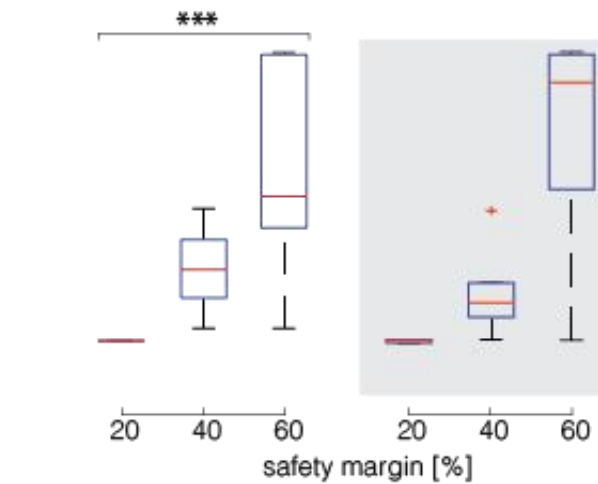
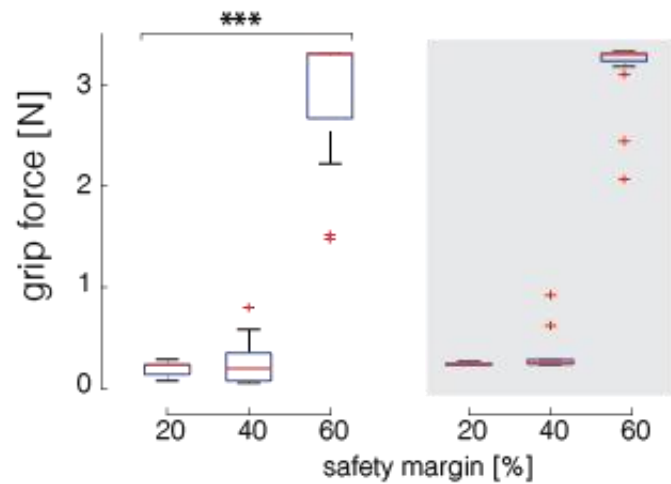
after weight drop



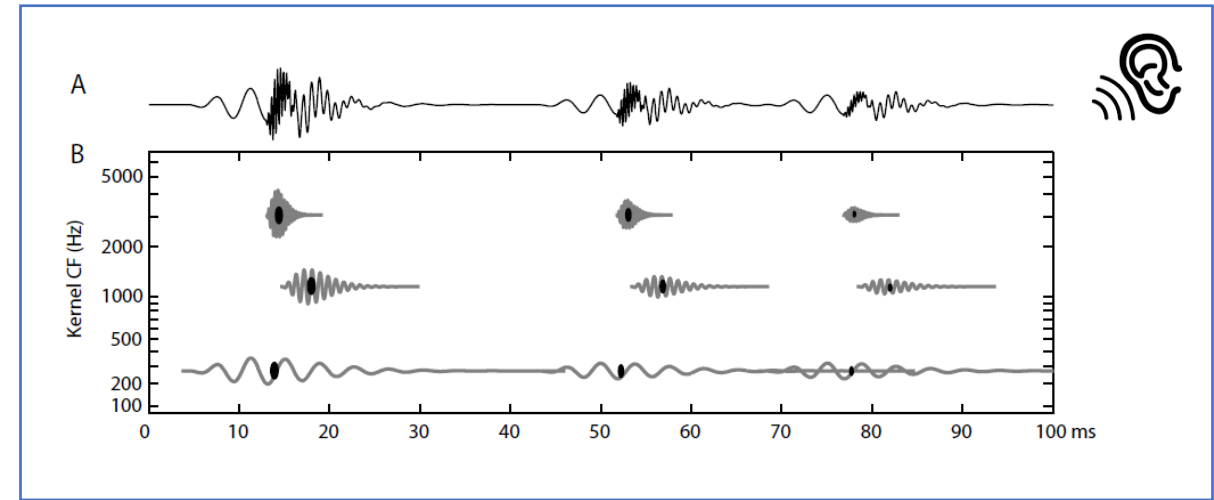
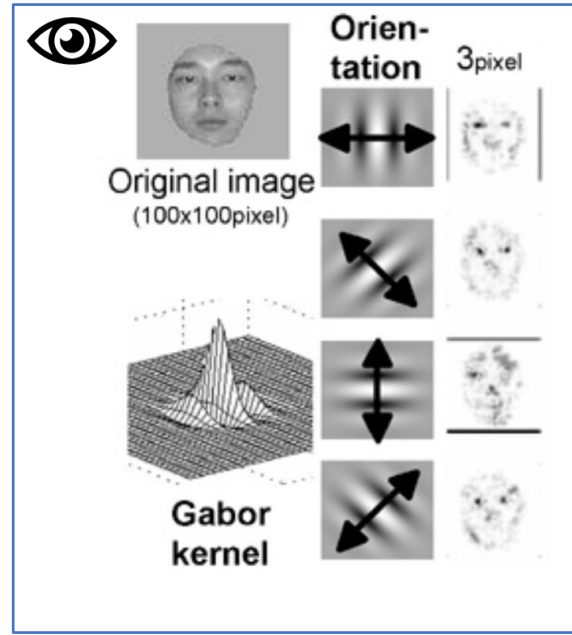
before weight drop



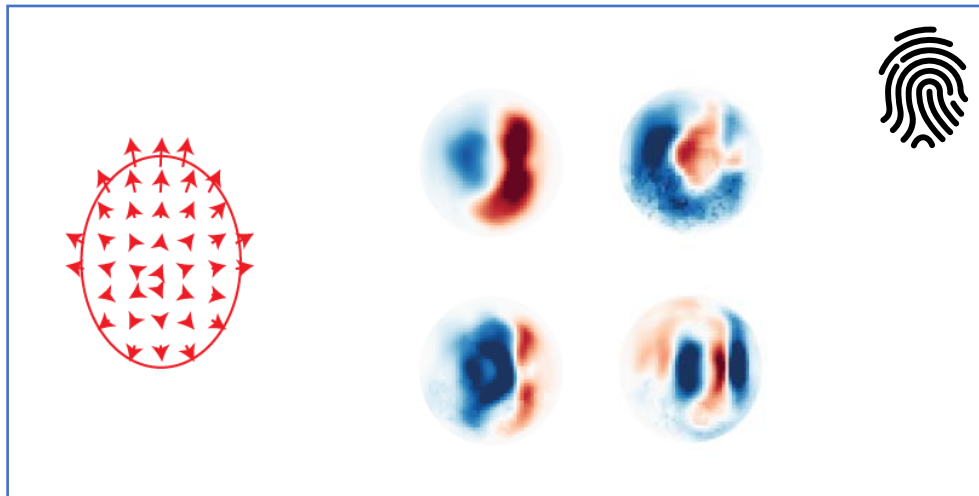
after weight drop



Conclusion



Bell et Sejnowski, 1997
Lewicki, 2002



- Minute lateral skin strains inform on:
 - **friction** on initial contact
 - **safety margin** during a lift
- We can use these patterns to predict frictional events and anticipate slippage in robotics

Thank you!

lwilleme@mit.edu

Hypotheses

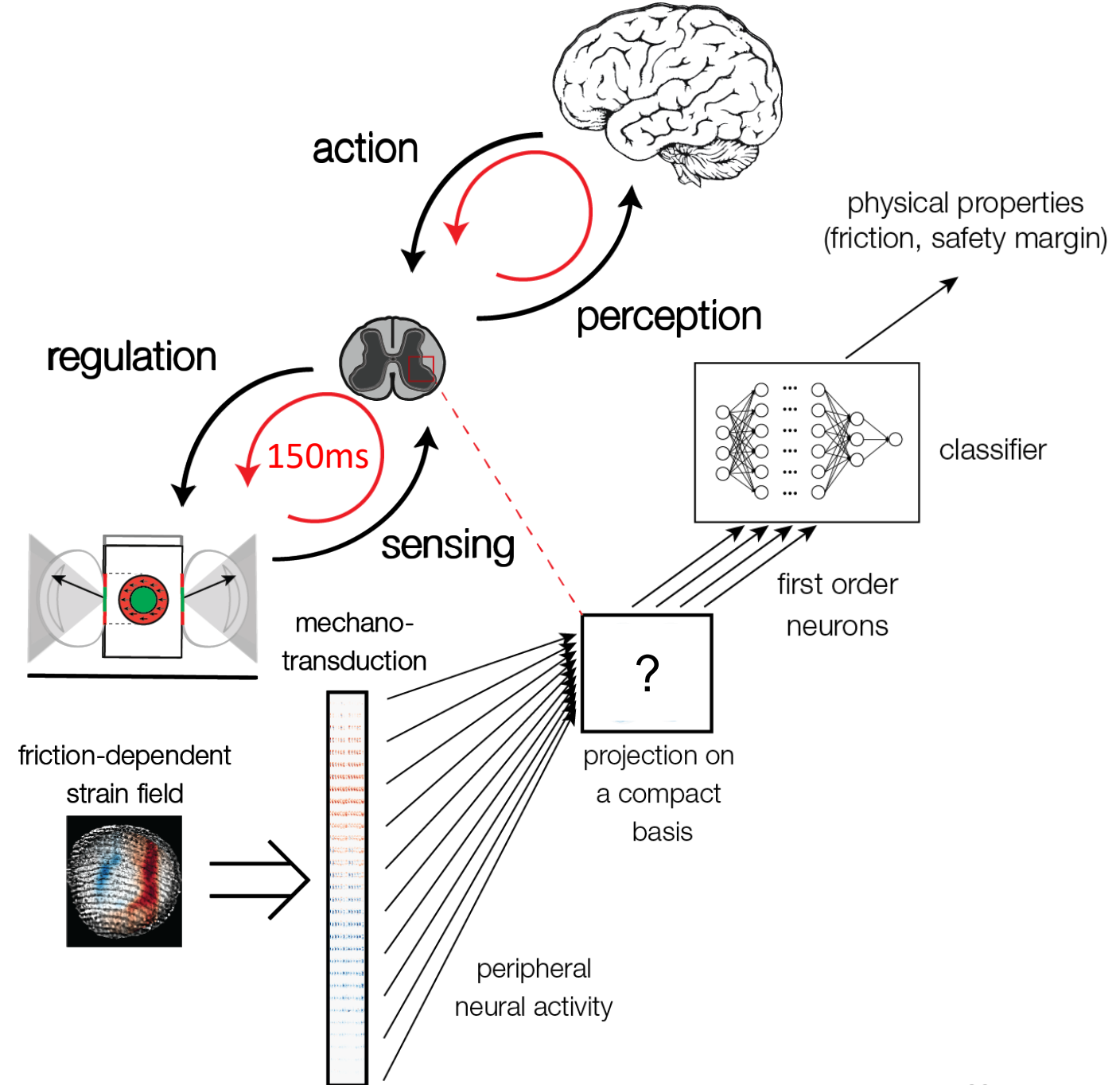
1) Regulation of grip force
supraspinally mediated

Cole et al., 1988
Johansson et al., 2004

Efficient coding strategy to
quickly infer physical
properties

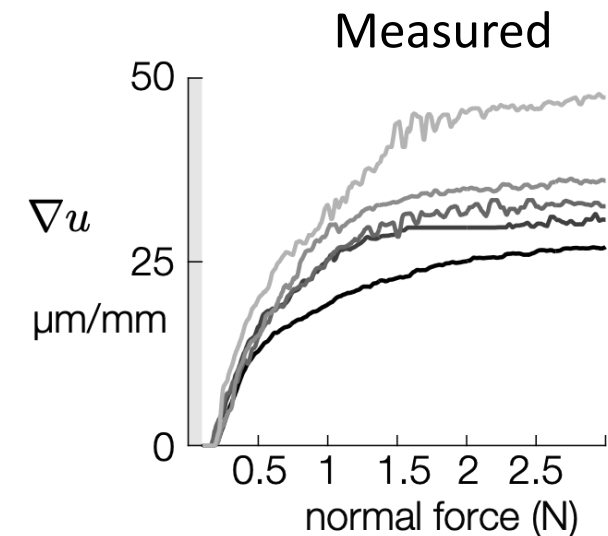
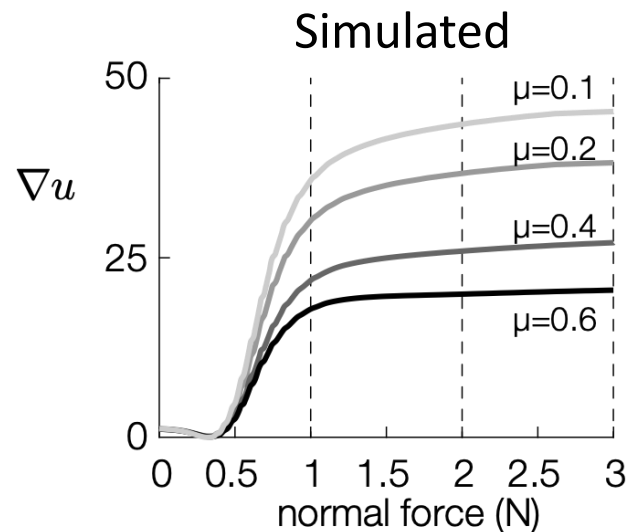
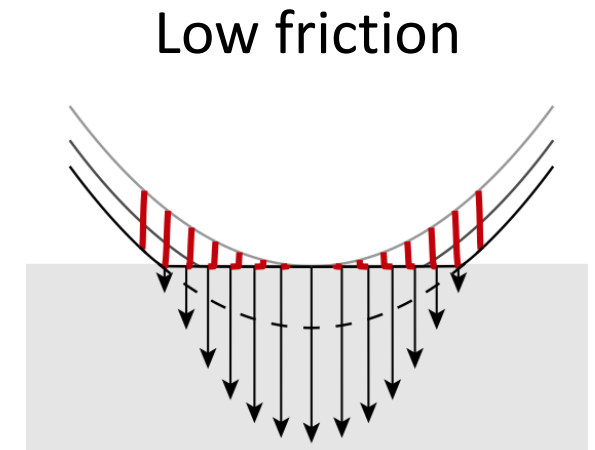
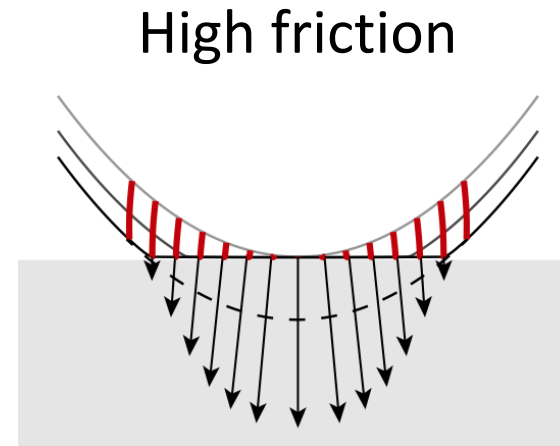
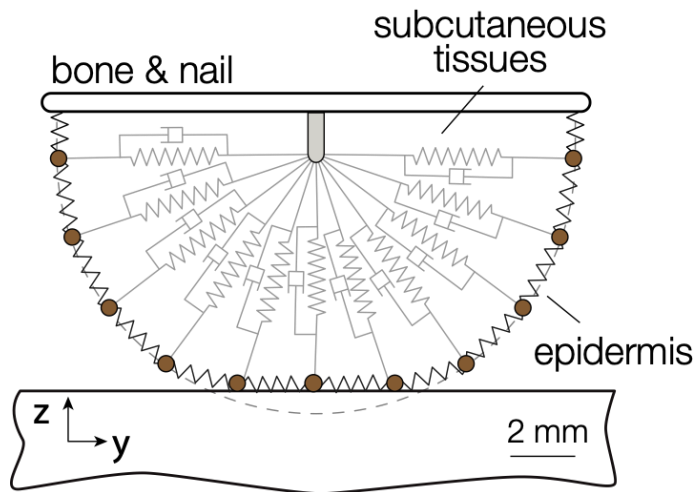
Barlow et al., 1961

2) Conscious perception
for planning and control

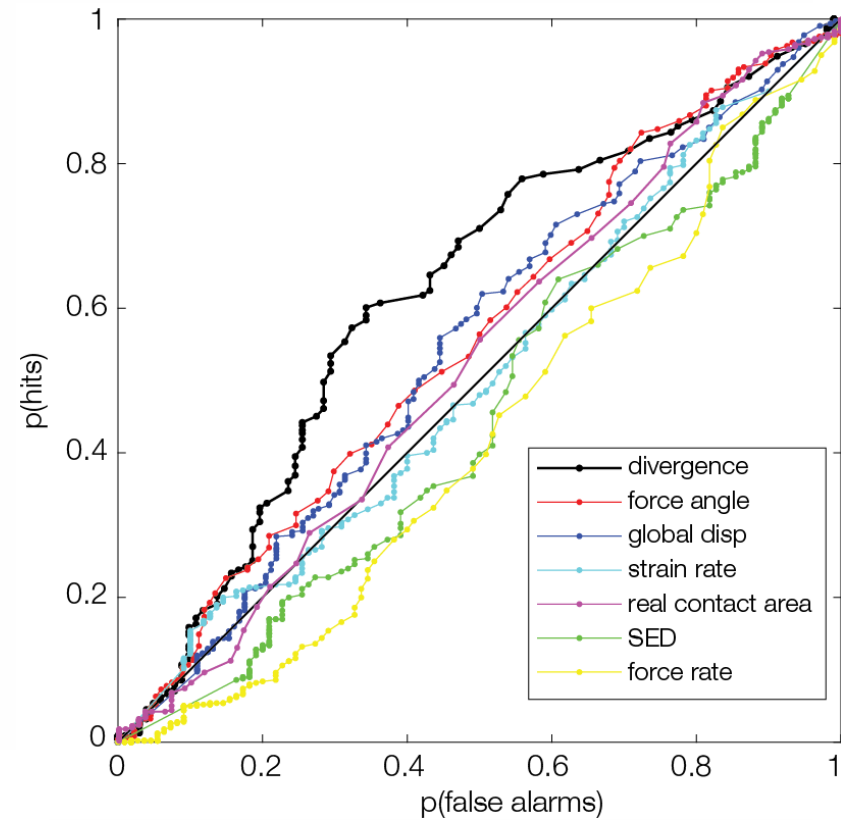
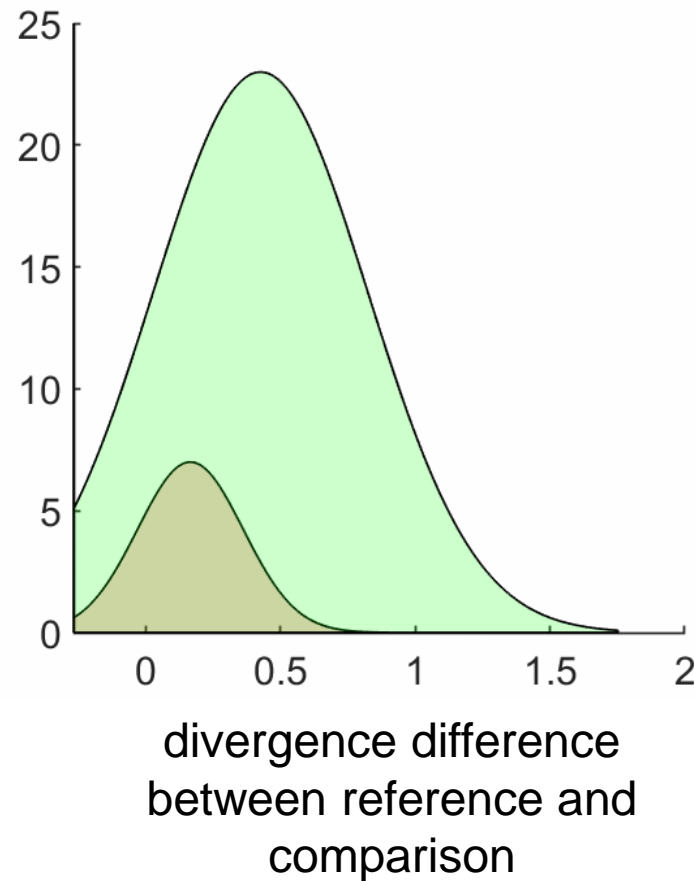


Where does the lateral strain comes from?

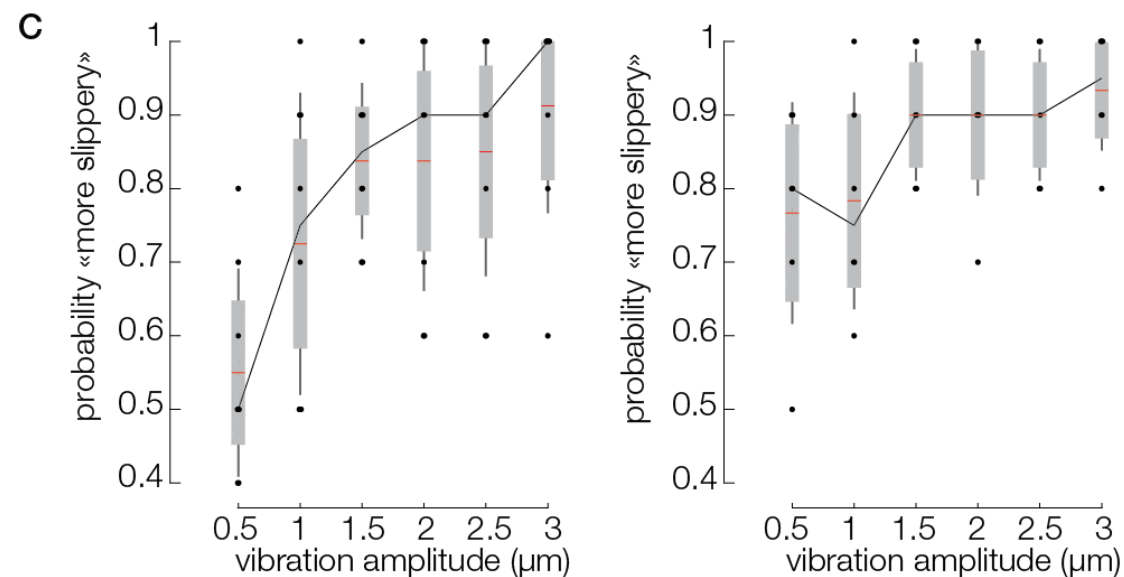
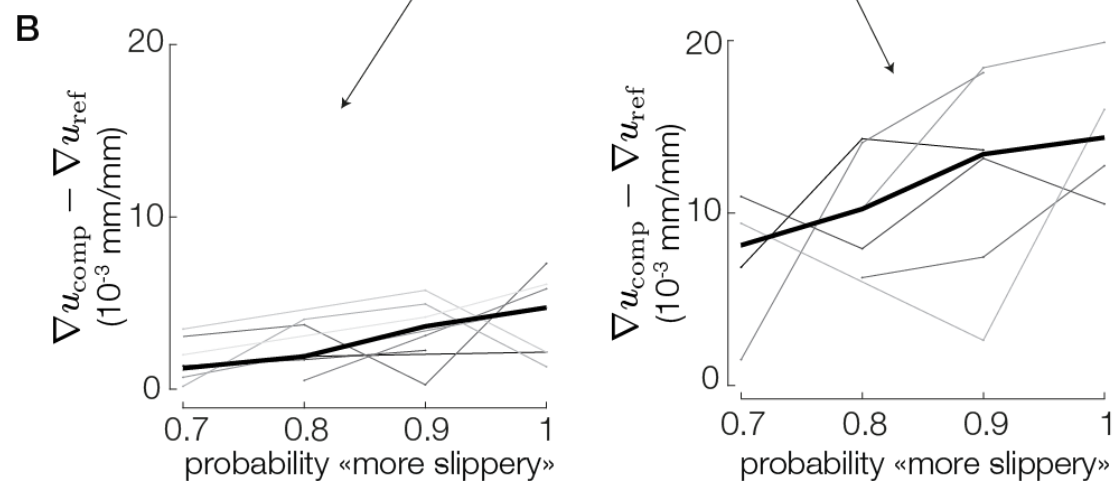
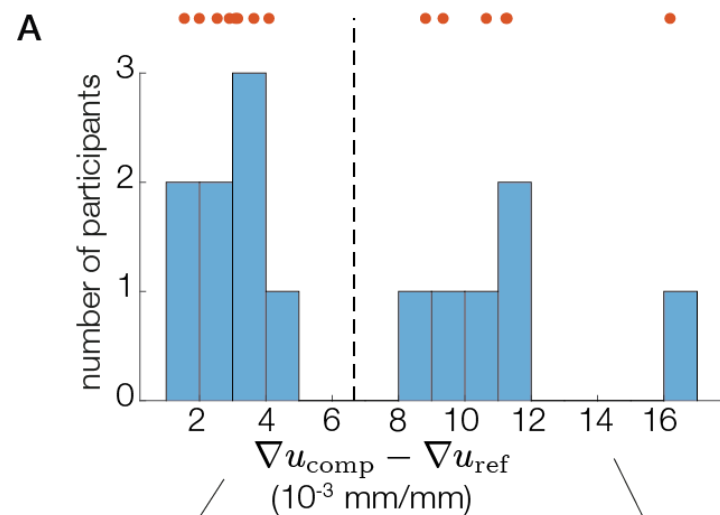
- Not predicted by Hertzian contact
- FDTD Simulation with friction



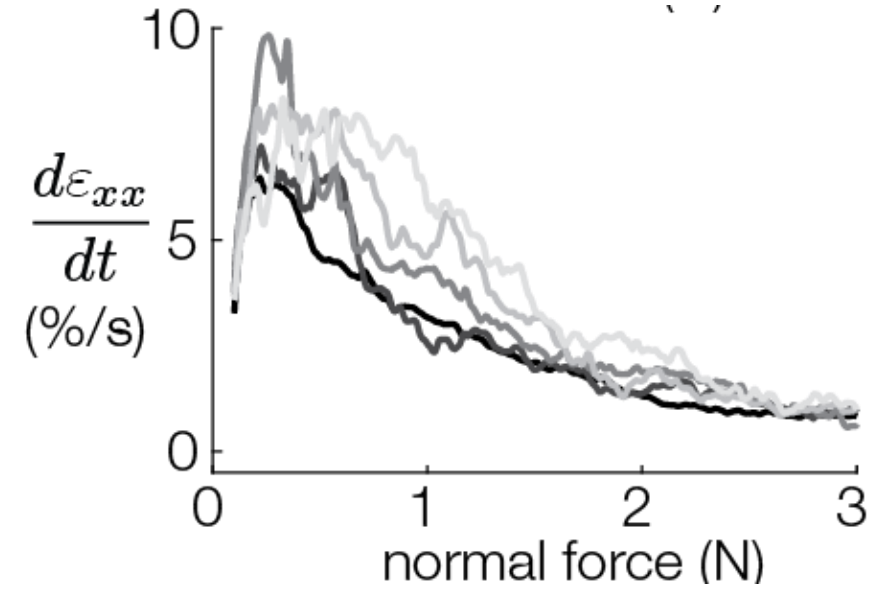
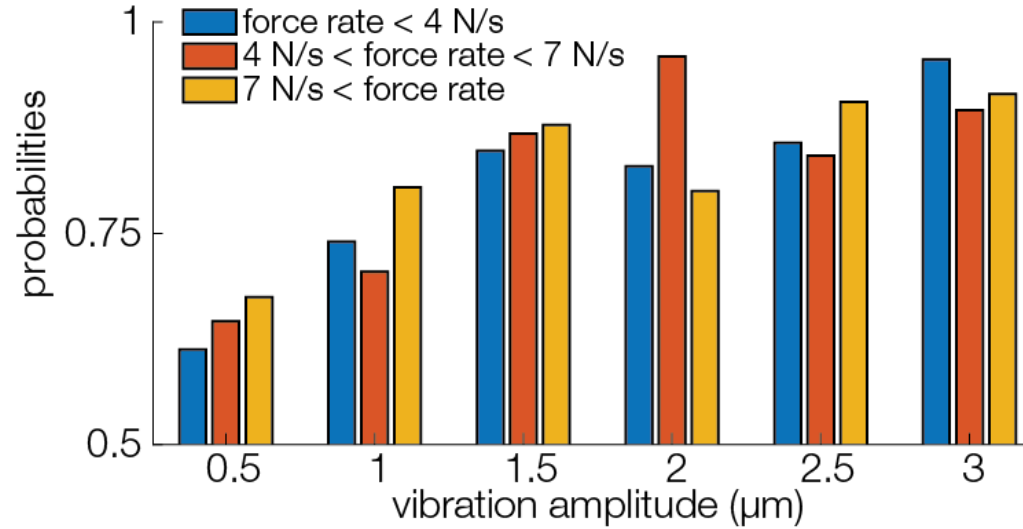
Skin deformation and friction perception



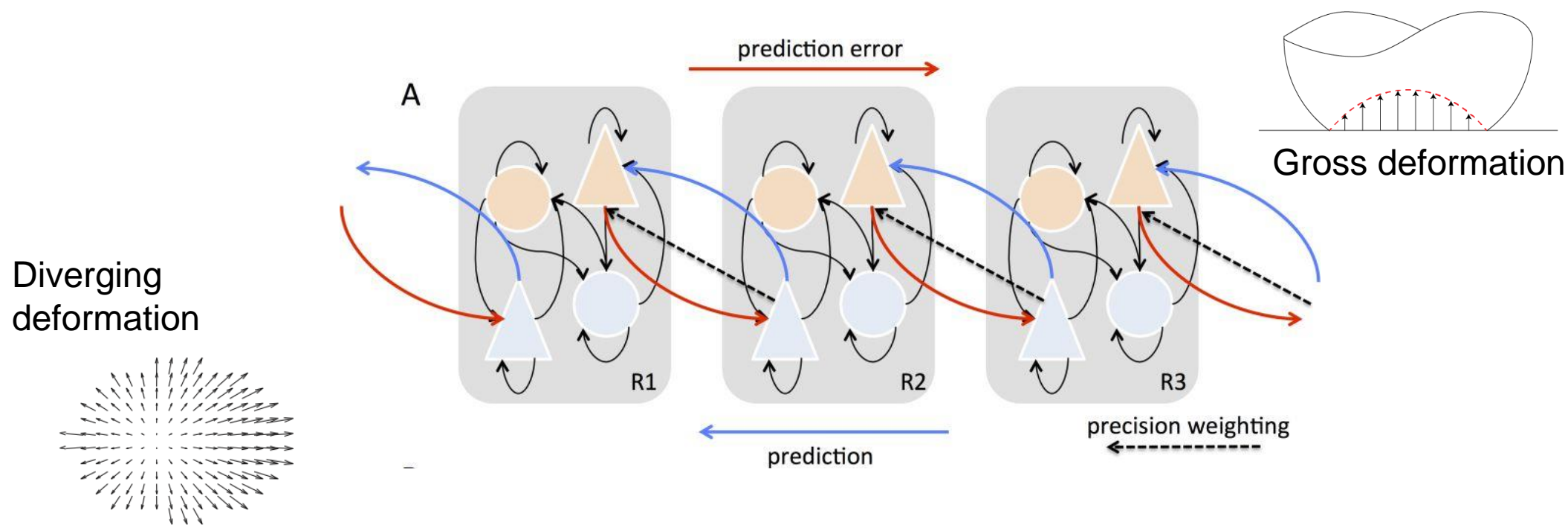
Individual performance



Strain rate



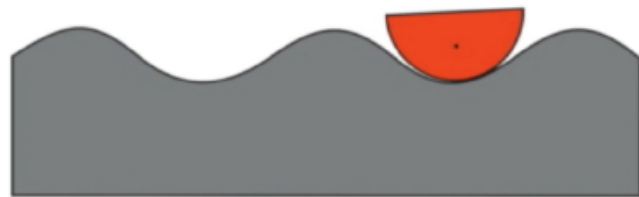
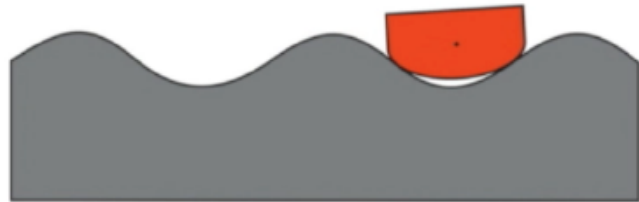
Sensation is a form of best guessing



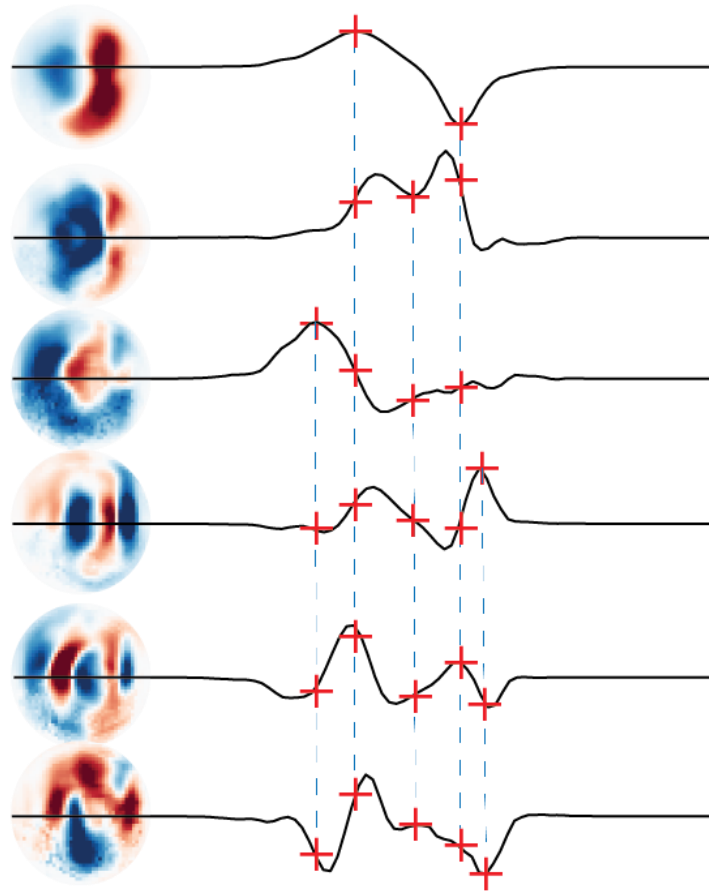
Sensor (orange) sliding on
a wavy object (gray)

Sensor on concave
part of object

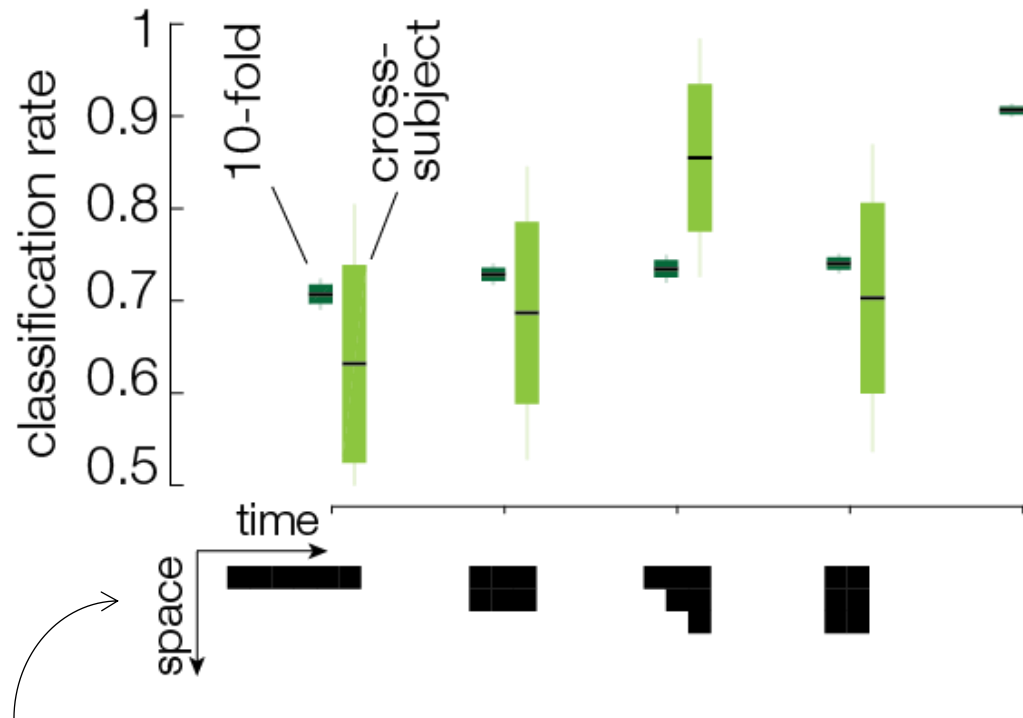
Contacting surface
covered by sensor



Hypothesis on mechanoreceptors placement



Effect of adding priors



Number of
bases used for
the estimation

Future work:

Experiment in unpredictable
conditions: same direction, same
speed.

During a grasping task



Felix Roel

