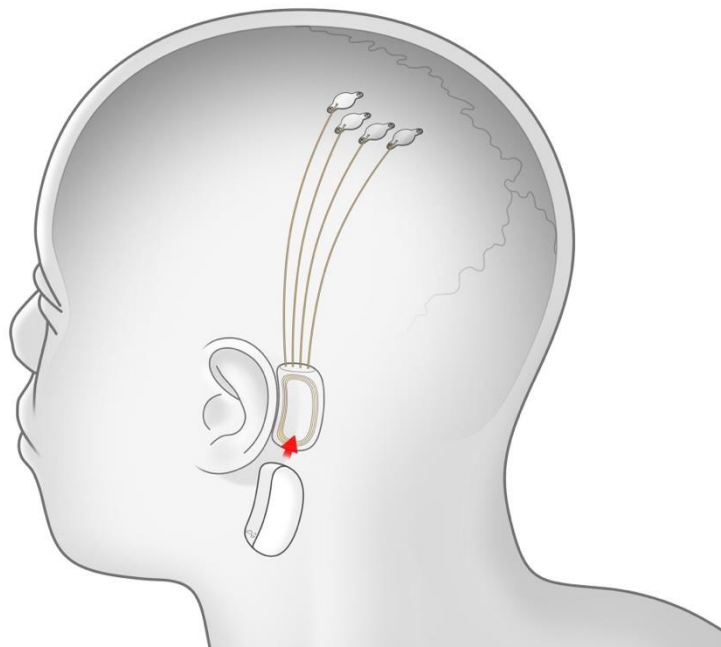


Bionic artificial limbs

Translational neuroengineering

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Prof. Silvestro Micera

Translational Neural Engineering lab, EPFL





The Motivation

- The loss of the upper limb is a traumatic event that changes the **quality of life** radically
- Reduction of
 - Ability in **reaching, grasping, and manipulation**
 - Ability to sense through the sense of touch
 - **Gesture** (communication)
- Causes:
 - Vascular deficiencies
 - Peripheral arterial disease
 - Diabetes (10% of people with diabetes have a foot ulcer)
 - Trauma:
 - Car Accident
 - Work accidents
 - Land mines
- Estimate of 0.1% to 0.5% of world population with amputation
- There are more than 1 million annual limb amputations globally

Few innovations in the past 50 years

Actual prostheses **do not satisfy** amputees' requirements and are very different from the natural model

The big challenges

Hand Prosthesis

How to design and develop a **more functional** and **naturally controlled** prosthetics hand?

Dexterity

Functionality

Reliability

...

...

Human Prosthesis Interface

How to **control** this dexterity?

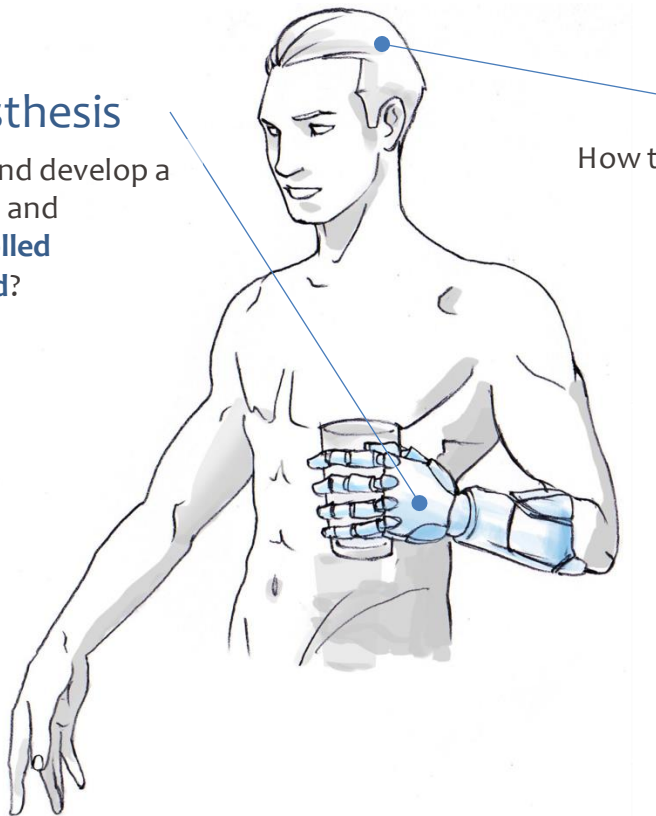
Sources

Cognitive Effort

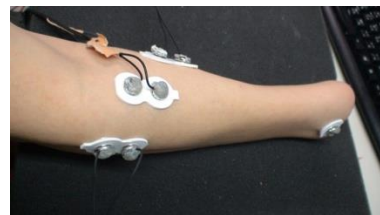
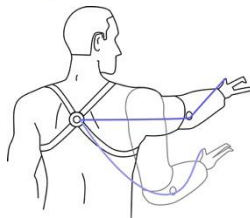
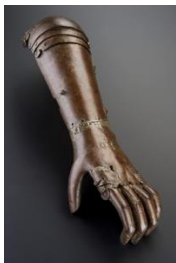
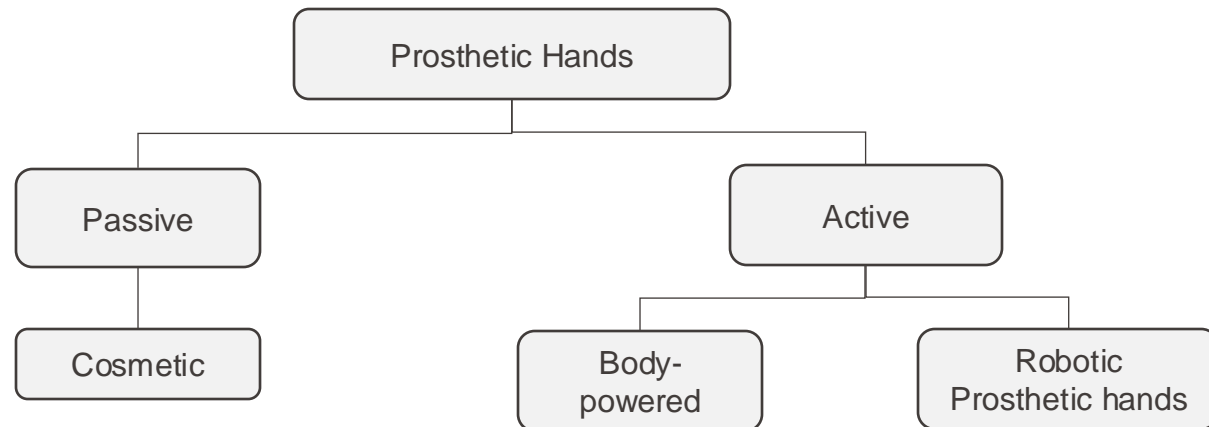
Reliability

...

...



Existing solutions for the actuation



Examples of robotic prosthetic hands



IH2 Azzura Hand
Prensila (IT)



Hannes Hand
IIT (IT)



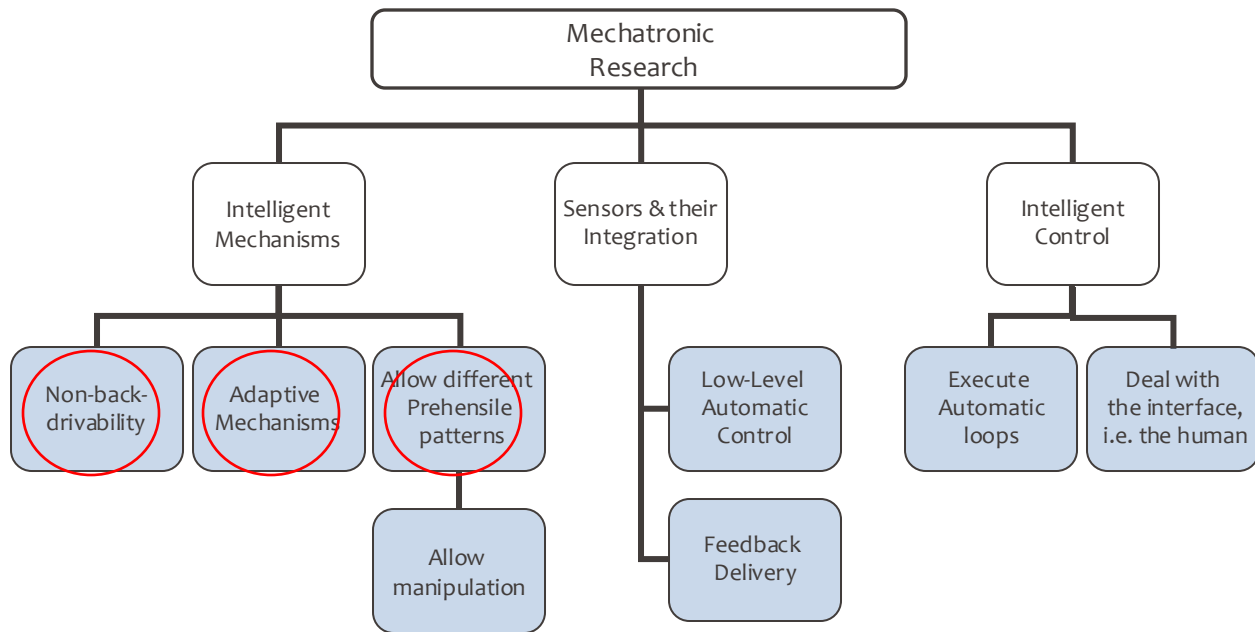
Open Bionics
Hero arm



Darpa Prosthetic
Hand (USA)

Be bionic hand
Ottobock (GE)

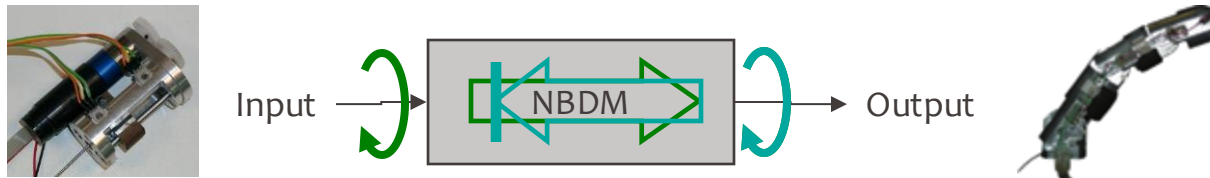
Key issues



Mechatronic

Design issues: non back drivability

Mechanisms wherein motions generated by the input (motor) drive are **transmitted** to the output (i.e. fingers) and wherein motions originated from the output are **blocked**



In a prosthesis it allows to maintain the grasp once the power supply is switched off
Non back drivable transmission = Power saving!= key in prosthetics!



Lead Screw



Worm Gear



Gear heads with high
reduction rate



Brakes/
clutches

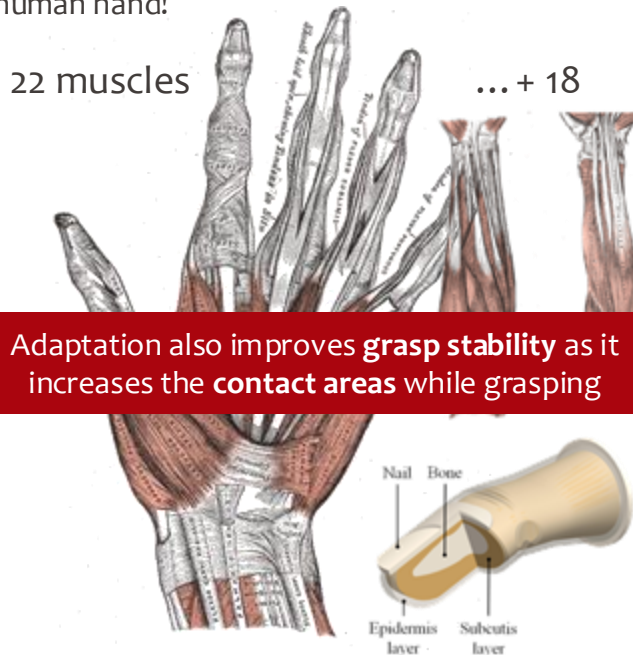
Mechatronic

Design issues: adaptability

Problem: It's an hard task to **design, actuate, and control** a self-contained artificial hand with a number of degrees of freedom (DoF) equal or close to those in the biological human hand!

22 muscles

... + 18

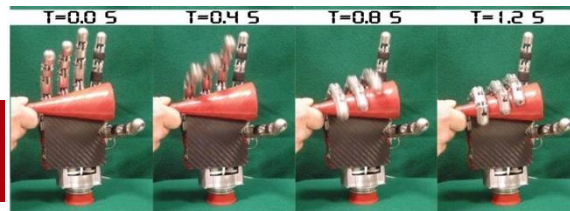


Adaptation also improves **grasp stability** as it increases the **contact areas** while grasping

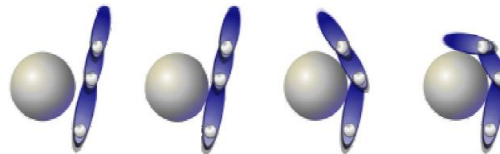
Phalanx adaptation mechanisms

Possible solutions (to simplify the problem):

- Cut DoFs; Rigidly couple DoFs;
- Implement adaptable mechanisms.



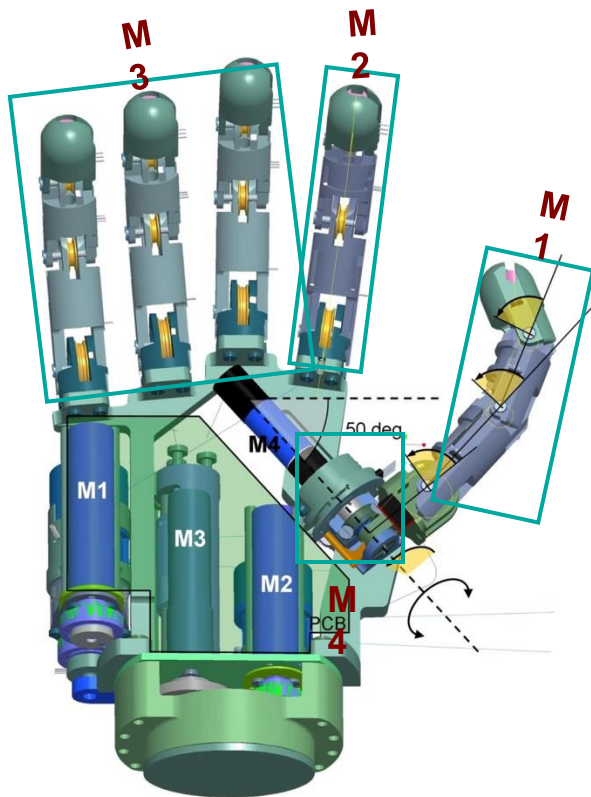
Hand adaptation mechanisms



Finger adaptation mechanisms

Underactuated mechanisms

The SmartHand prototype

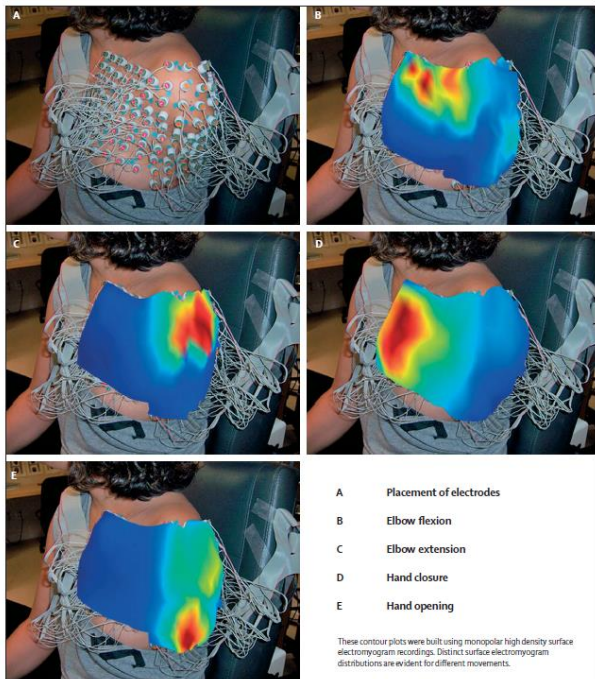


Mechanical Spec

Weight	600 gr
Size	Human inspired
Degrees of freedom	16
Degrees of actuation	4
Full flexion speed	<1.5 s
Tendon max active force	45 N
Grasp force (Cyl, Lat, Lift)	<30, <5, 100 N

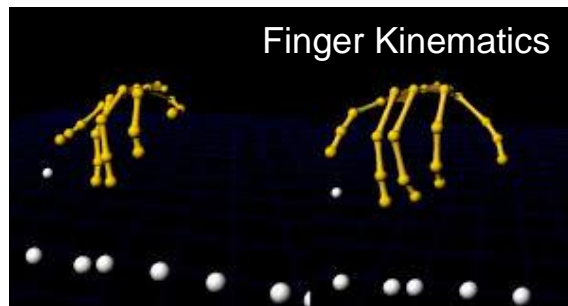
Position (digital encoder)	4
Position (Joint Hall sensors)	15
Position (Potentiometer)	2
Tension Sensors (strain gauges)	5
Limit switch (digital)	8

Power req.	12V /3A
Control loops	Position and tension (1kHz)
Reading delays	< 1 ms
Total preset grasps	10 (programmable)
Communication	RS232 /USB



Motor decoding

What to decode

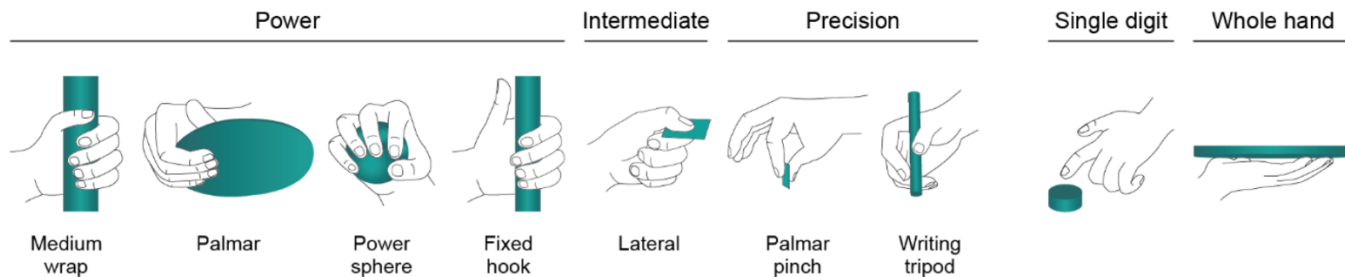


Grasping types

A

Prehensile

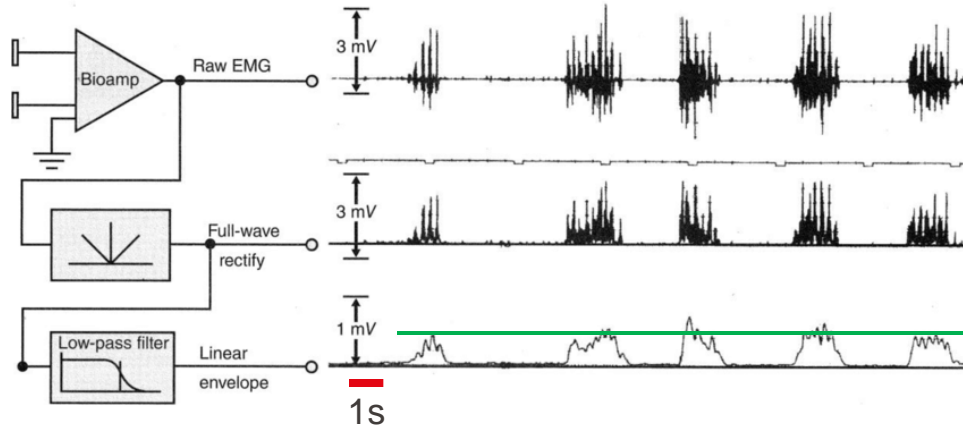
Non-prehensile



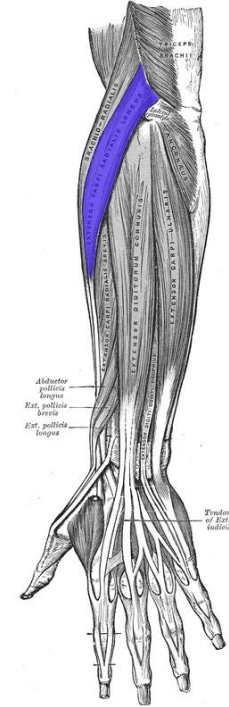
Feix, Thomas, et al. "The grasp taxonomy of human grasp types." *IEEE Transactions on human-machine systems* 46.1 (2015): 66-77.

Electromyography (EMG) decoding: basic approach

Extensor carpi radialis longus muscle (wrist extension)



Thresholding



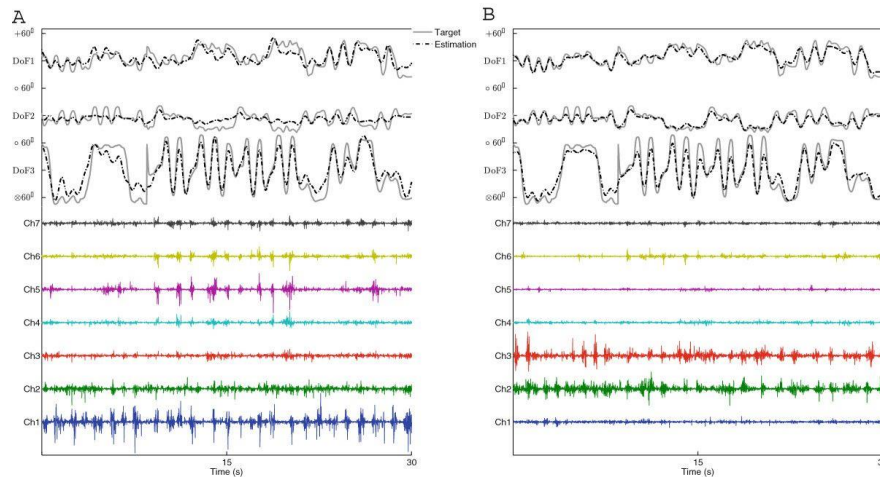
EMG decoding: basic approach

- The majority of commercially available RPHs use threshold-based sEMG decoding over a few surface electrodes
- Generally, control of 1 DoF
- Sometimes more DoF, by cycle through different types of grasps:
 - Non intuitive
 - Cannot be used for multi DoF



EMG decoding: machine learning approach

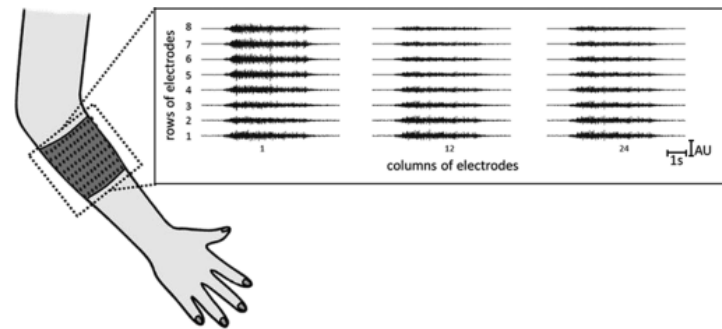
- Using machine learning approach (artificial neural network, ANN): proportional and simultaneous control of 3 DoFs of the wrist joint (flexion/extension, radial/ulnar deviation, and pronation /supination).



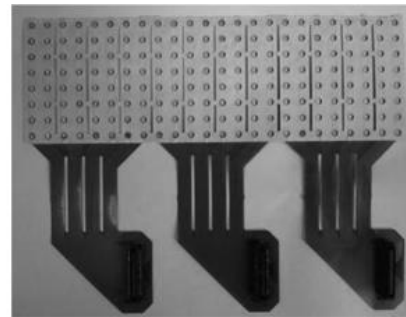
Jiang, Ning, et al. "EMG-based simultaneous and proportional estimation of wrist/hand kinematics in uni-lateral trans-radial amputees." *Journal of neuroengineering and rehabilitation* 9.1 (2012): 42.

High density EMG

- In general, robustness and reliability of classical pattern recognition systems are influenced by **electrode shift during don and doff**, and by the presence of **malfunctioning channels**
- HD EMG grid of electrodes is an ensemble of sensors that records data spatially correlated.
- The variogram is a function that describes the spatial correlation between observations.



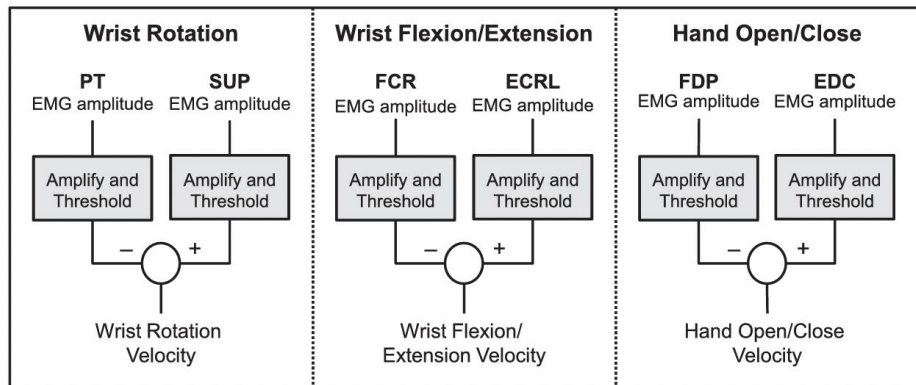
(a)



(b)

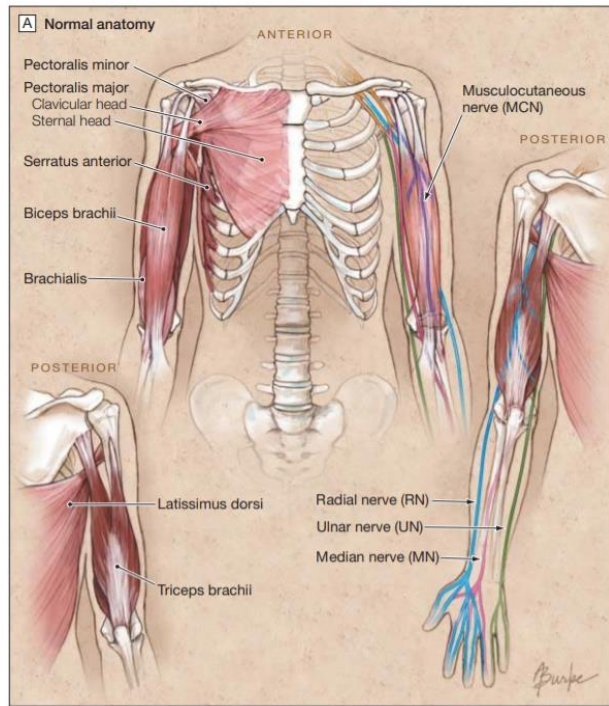
Intramuscular EMG (iEMG) control

- Clinically available myoelectric control strategies do not allow simultaneous movement of multiple degrees of freedom (DOFs)
- The use of implantable devices that record intramuscular EMG signals could overcome this constraint
- Intramuscular EMG signals can be recorded using percutaneous fine wire electrodes inserted using needles
- The use of iEMG can allow to use proportional control (but of course also pattern recognition)

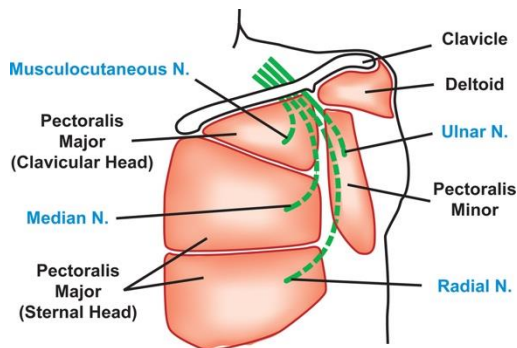
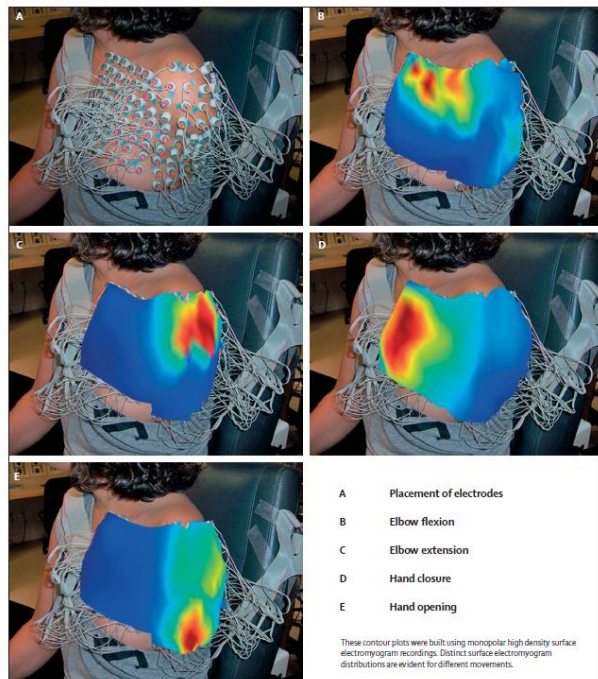


Improve intuitiveness for prosthetic users: targeted muscle reinnervation (TMR)

- Years after amputation, severed nerves still carry information about movements.
- **But**, these nerves no longer have muscle effectors → this important neural information is unavailable via classic EMG recording.
- **Solution**: nerves severed because of arm amputation could be surgically transferred to **spare** 'target' muscles i.e., muscles rendered biomechanically redundant after loss of the arm. This technique is called **Targeted muscle Reinnervation (TMR)**



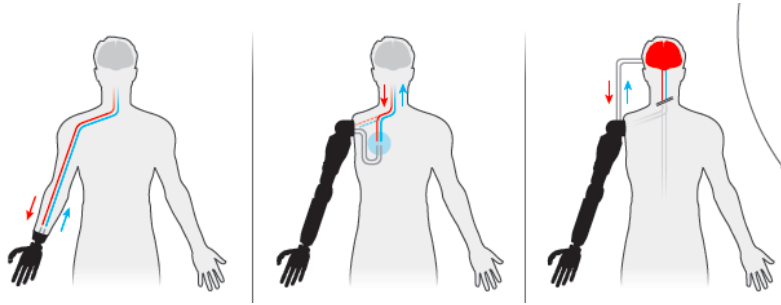
Targeted muscle Reinnervation



Muscles could be used as *bioamplifiers*

- After reinnervation, contraction of target muscles and EMG signal generation occurs in response to neural control information intended for the missing limb.
- Example: The patient wants to close their missing hand, the transferred median nerve causes depolarization of its target muscle, generating EMG signals that are used to close the prosthetic hand.
- This results in a faster, easier and more intuitive control of the prosthesis control.

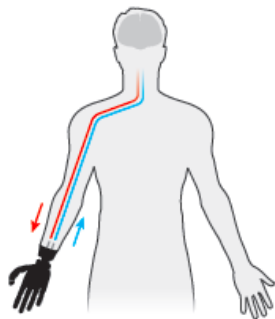




Sensory feedback

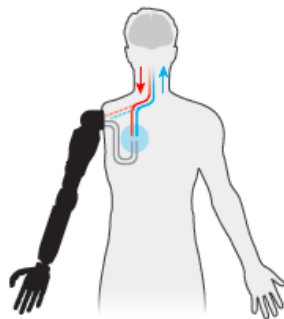
Sensory feedback

Real-time, and natural feedback from the hand prosthesis to the user is essential in order to enhance the control and functional impact of prosthetic hands in daily activities, prompting their full acceptance by the users



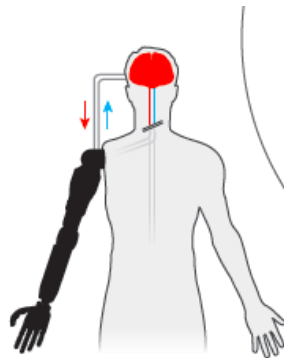
Use the remaining nerves

Electrical leads from the prosthetic's sensors stimulate nerves in the person's stump that once served the real limb.



Move the nerves

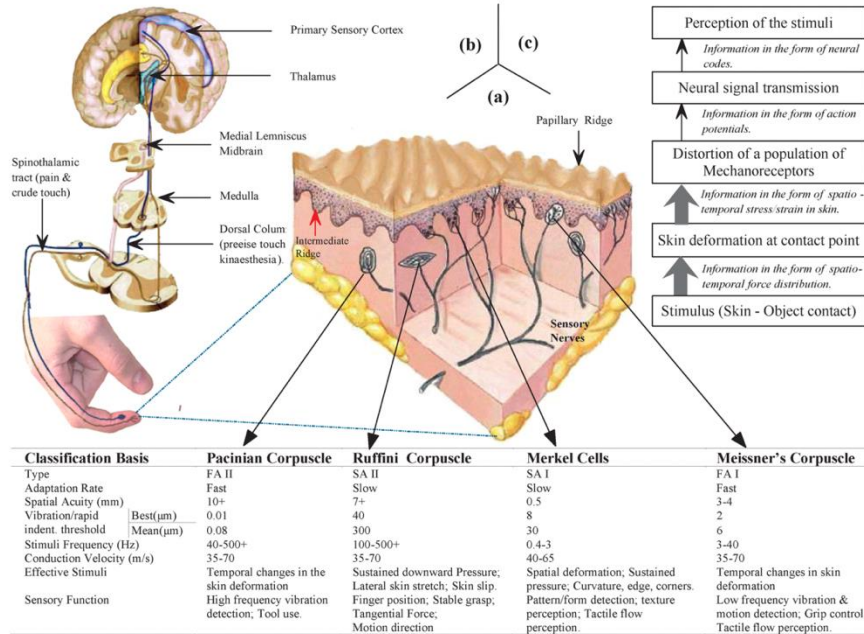
Re-routed nerves grow new endings into muscle and skin, where external devices translate signals going to and from the prosthesis.



Stimulate the brain

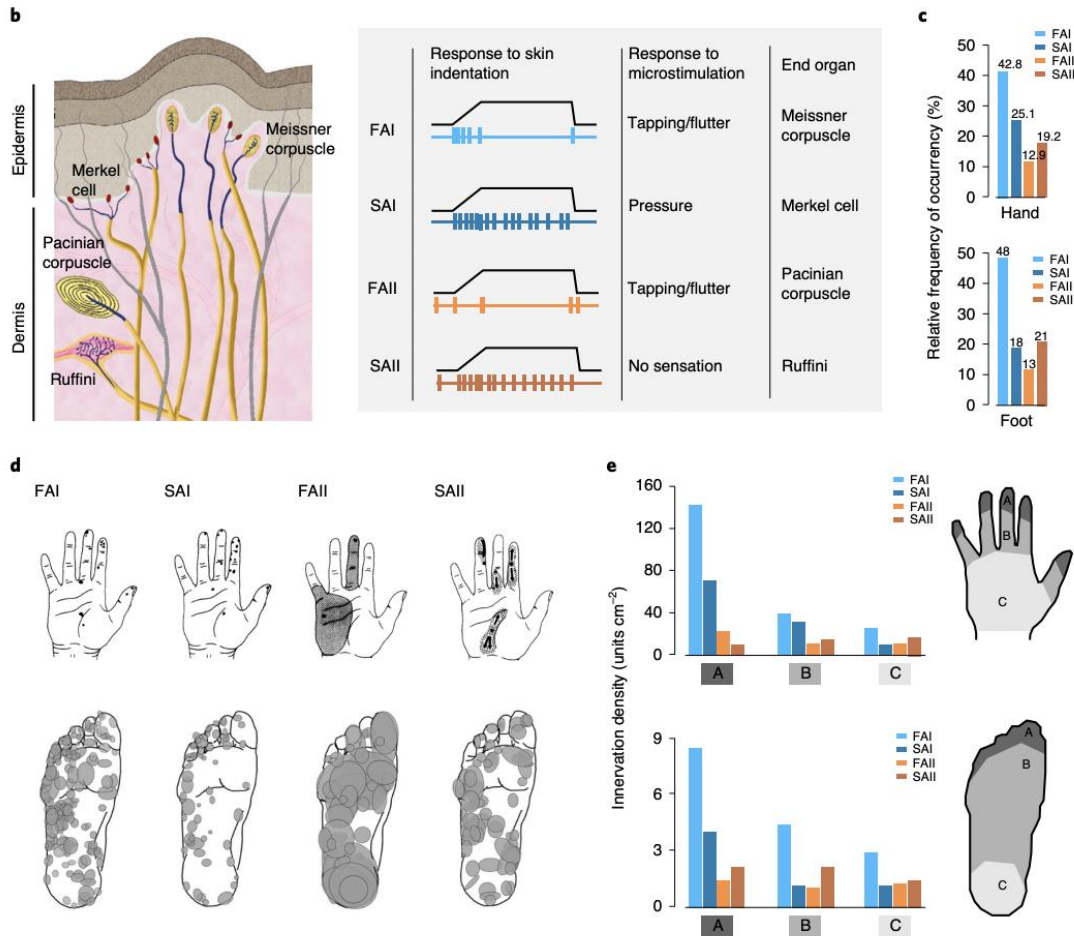
Sensory signals are routed around a severed spinal cord and into the brain, where they produce sensations by direct stimulation of the cortex.

Human touch system

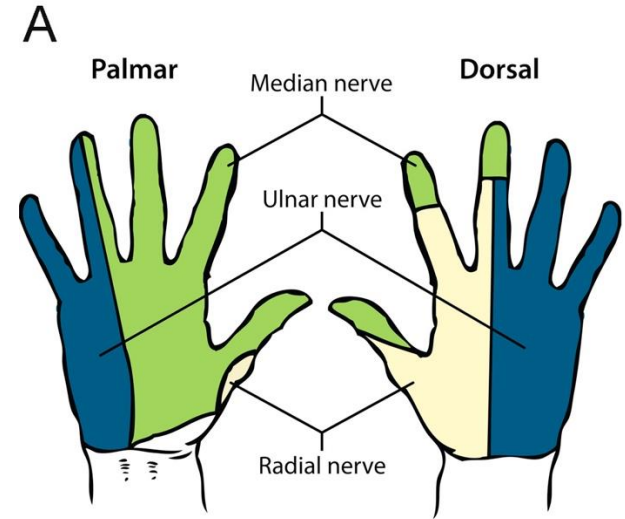
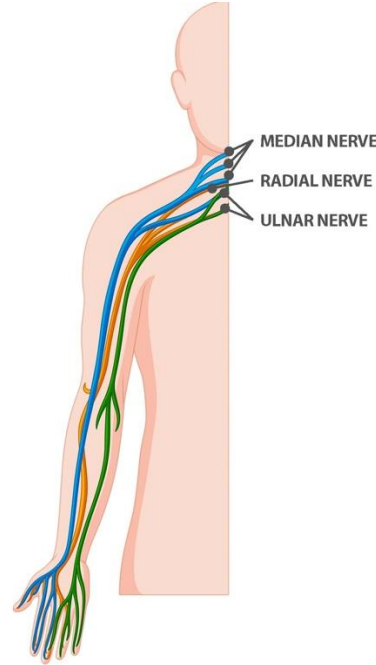
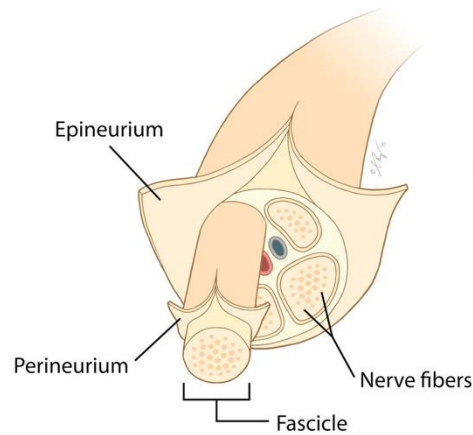


- During object manipulation and tactile exploration, the glabrous skin of the hand undergoes complex spatiotemporal mechanical deformations, which in turn, drive very precise spiking responses in individual afferents
- Coarse object features, such as edges and corners, are reflected in spatial patterns of activation in slowly adapting type I (SA1) and rapidly adapting (FA) fibers, which are densely packed in the fingertip
- At the same time, interactions with objects and surfaces elicit high-frequency, low-amplitude surface waves that propagate across the skin of the finger and palm and excite vibration-sensitive Pacinian (PC) afferents all over the hand

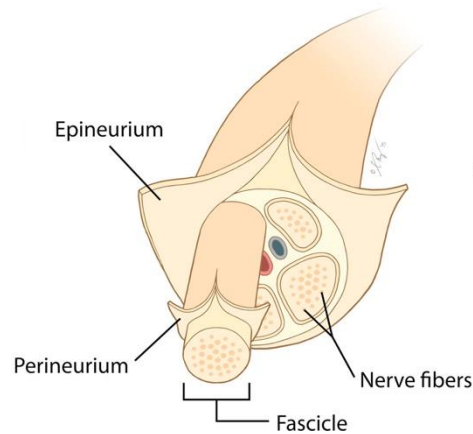
EPFL Human touch system



Structure of the nerve



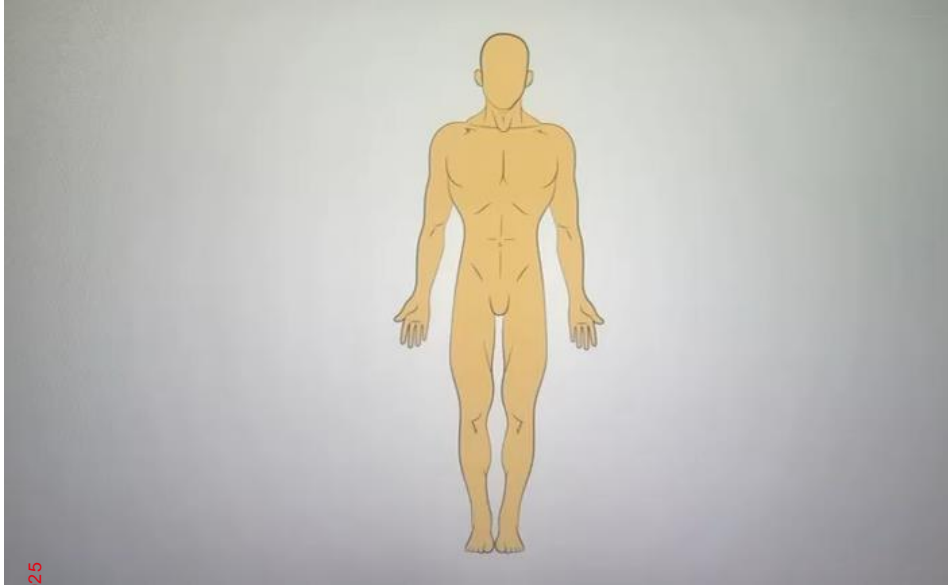
Structure of the nerve



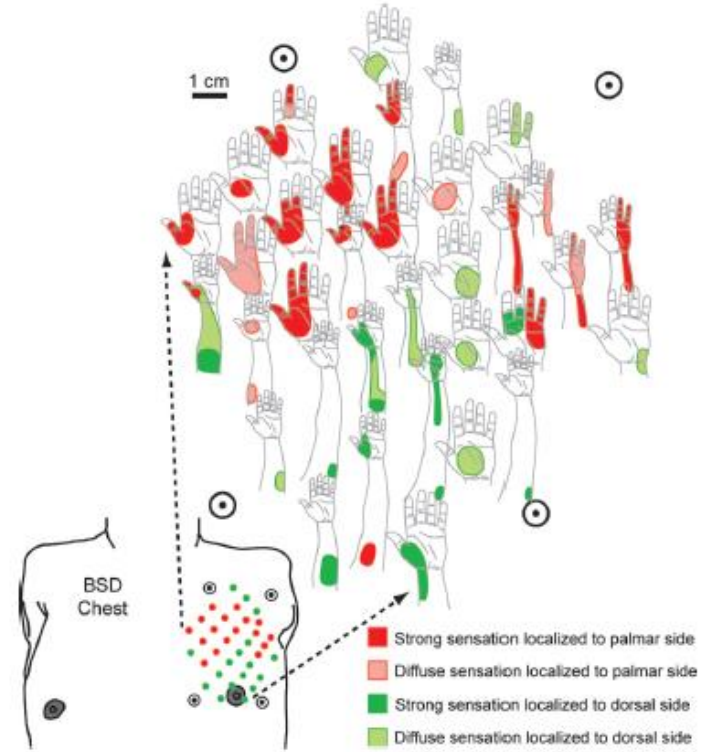
Fiber type	Fiber size (μm)	Function
A α	12–20	Somatomotor, proprioception
A β	5–12	Touch, pressure
A γ	3–6	Muscle spindle
A δ	2–5	Pain and temperature
B	<3	Preganglionic autonomic
C	0.4–1.2 (unmyelinated)	Postganglionic autonomic, pain, temperature

Adapted from Snell (2010).

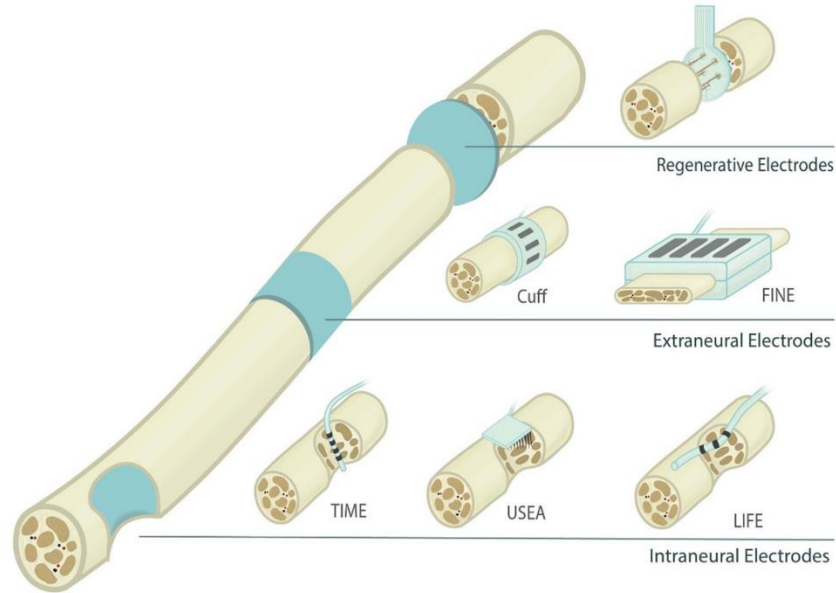
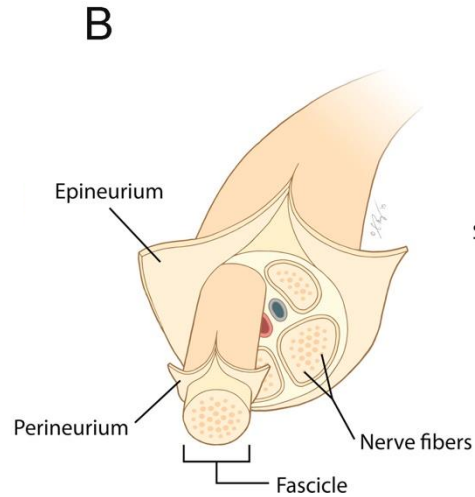
Targeted Sensory Reinnervation



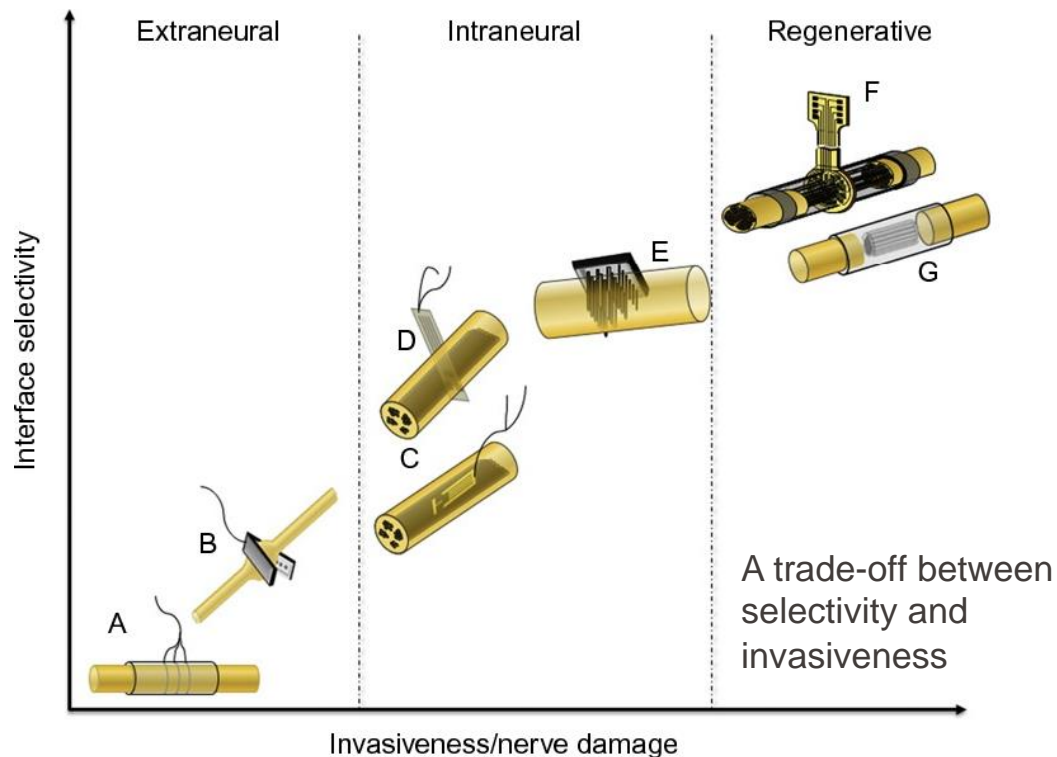
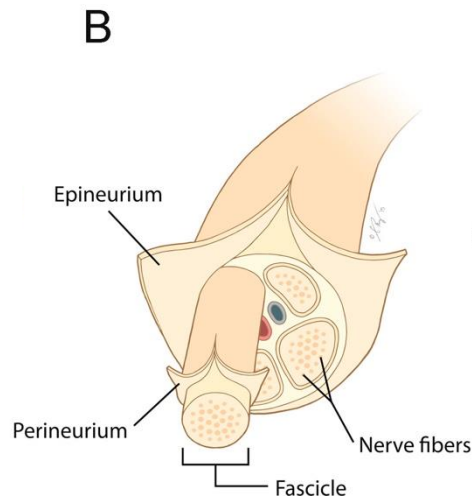
03/03/2025



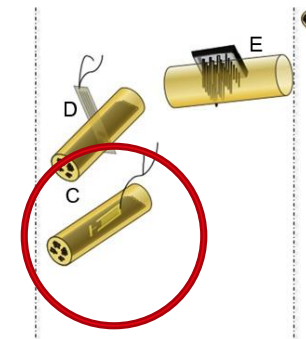
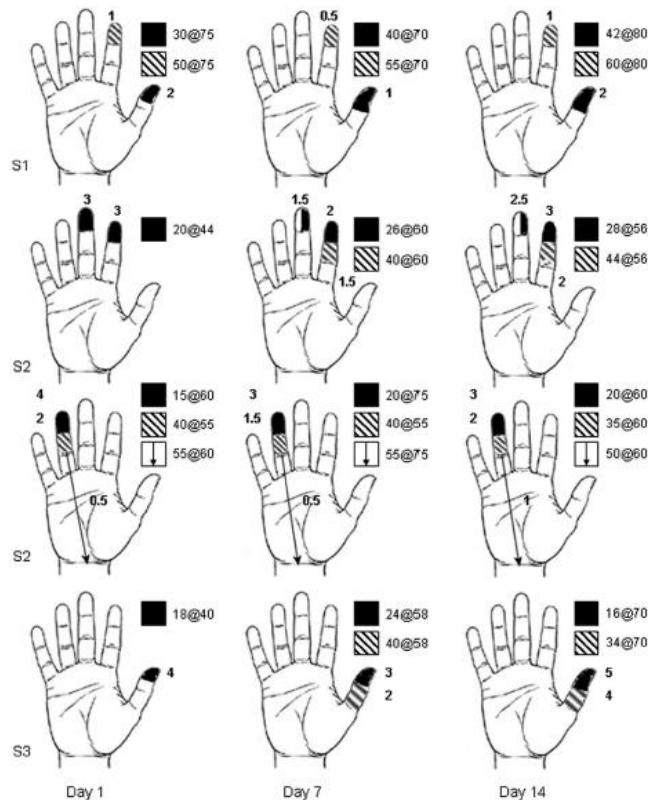
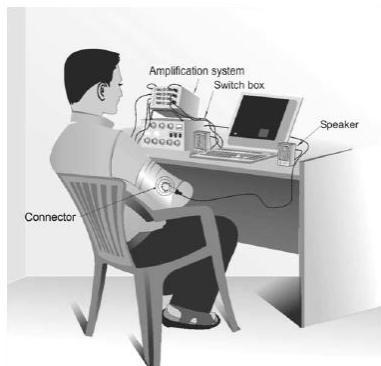
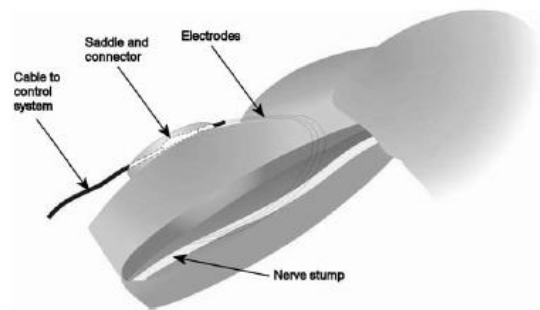
Peripheral neural interfaces



Peripheral neural interfaces

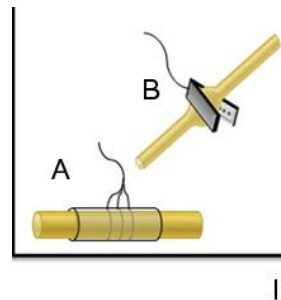
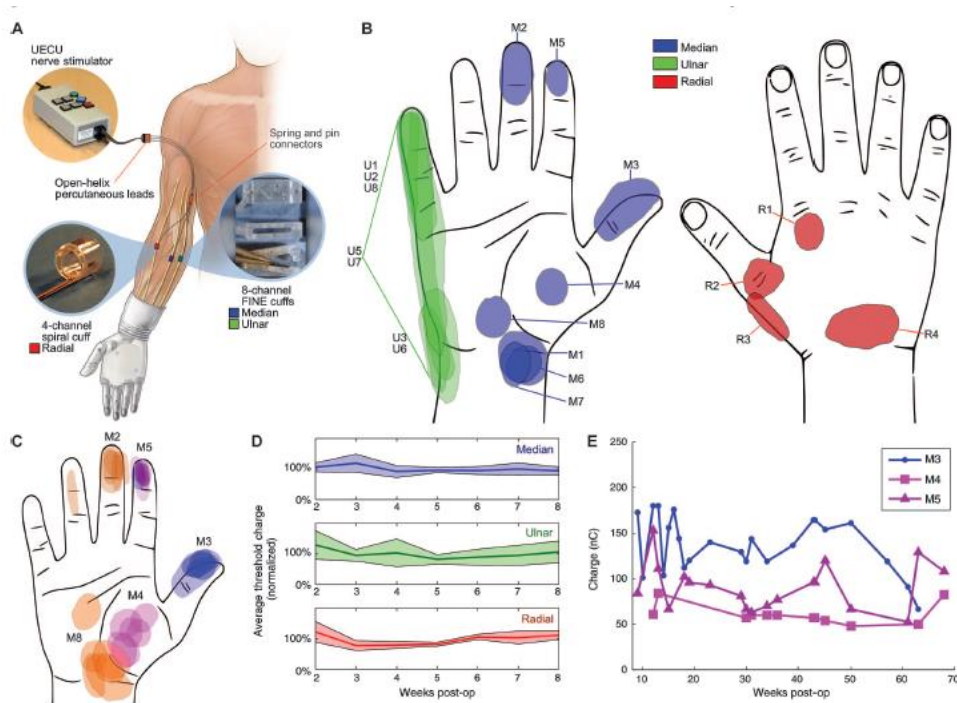


Example of intraneural stimulation



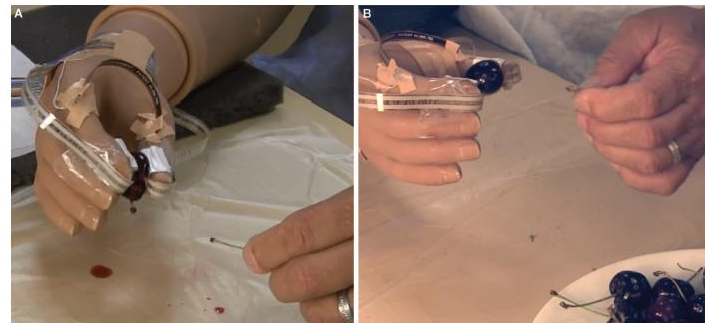
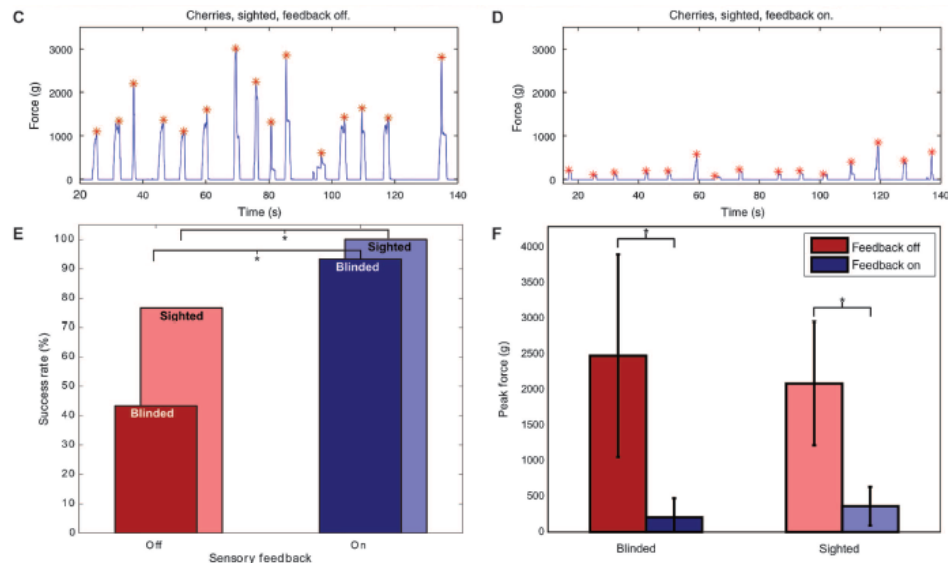
LIFE electrode

Example of extraneural stimulation

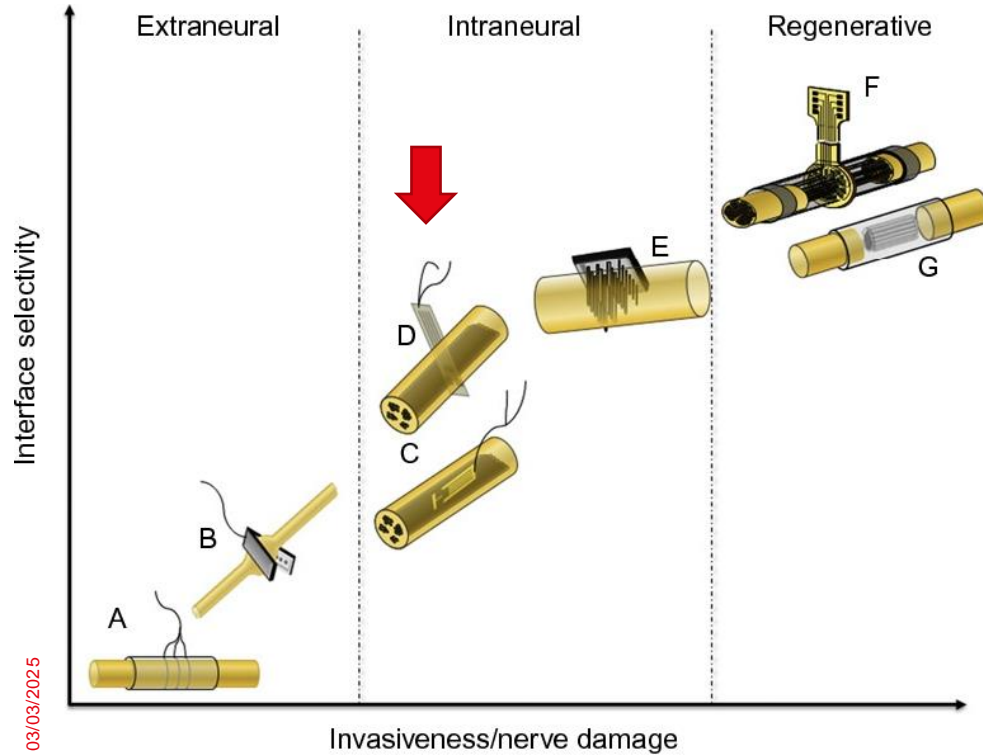


CUFF and
FINE electrodes

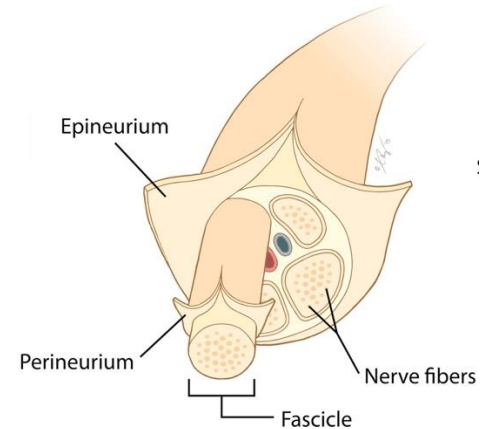
Example of extraneural stimulation



Improvement in a functional task when sensory feedback was present.

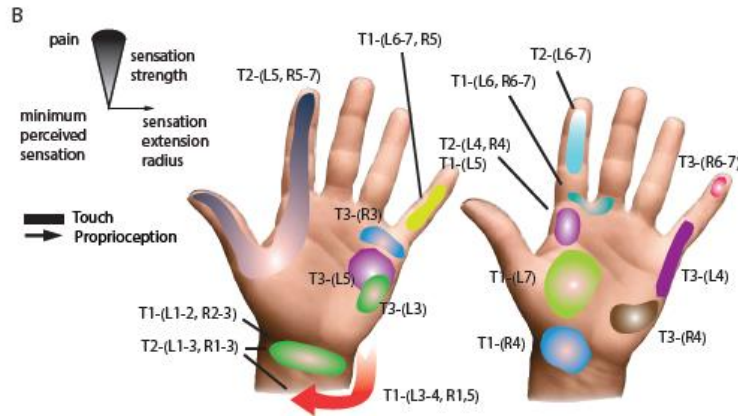
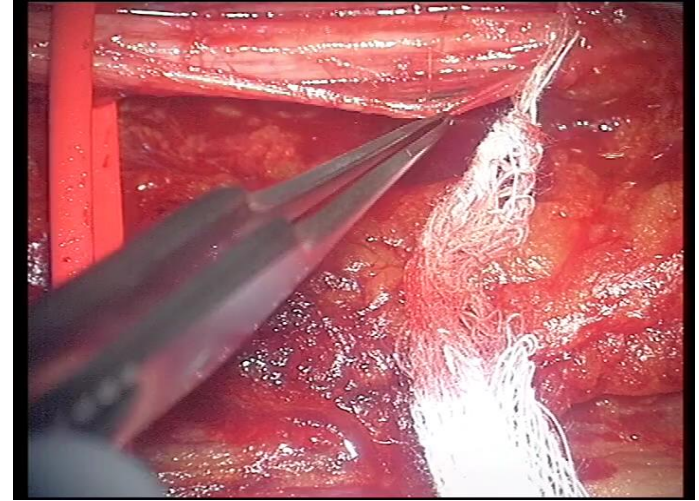


Transverse Intrafascicular Multichannel Electrode (TIME)

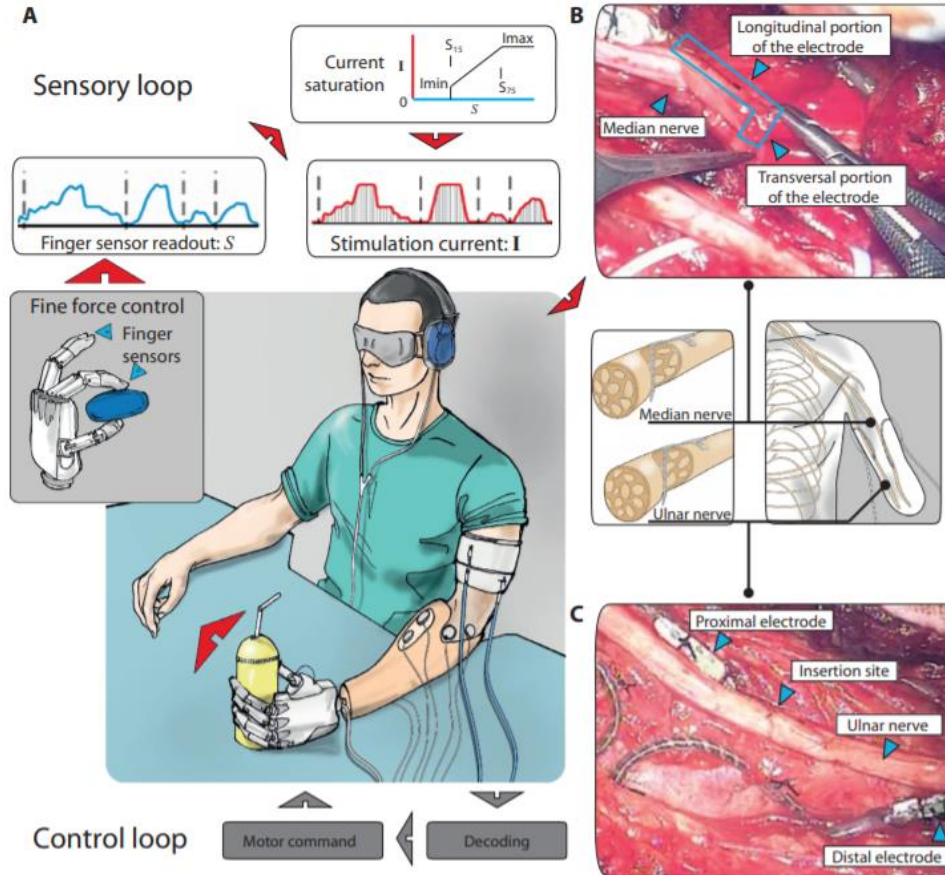


Bidirectional neuro controlled hand prostheses

- Four week implant in a 35-year-old man, from Denmark with a trans-radial amputation in 2004 (fireworks accident)
- Two TIMEs in the median and two in the ulnar nerve

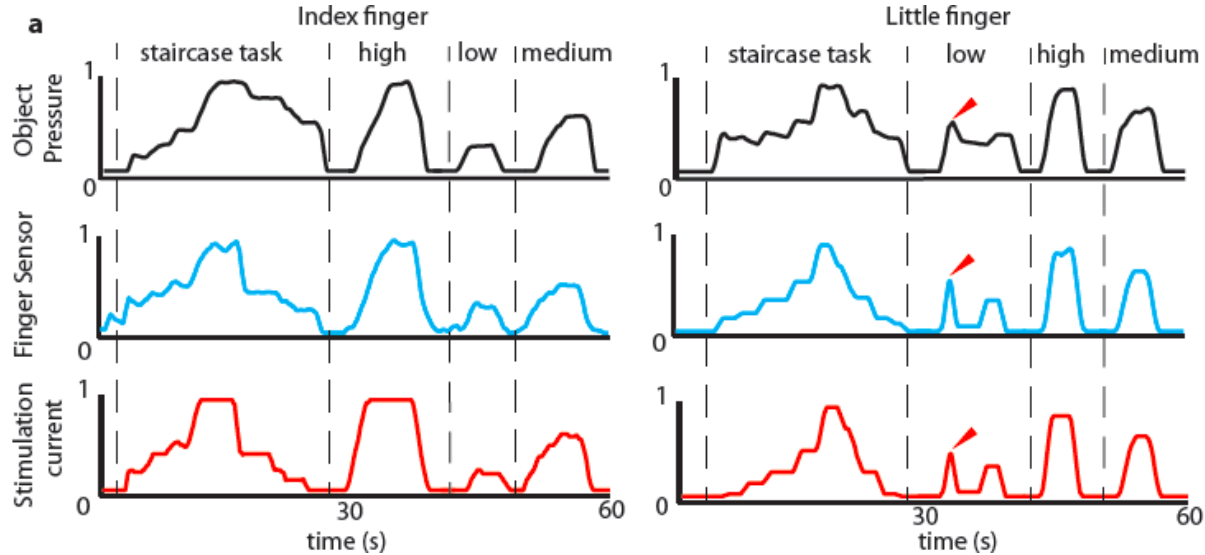


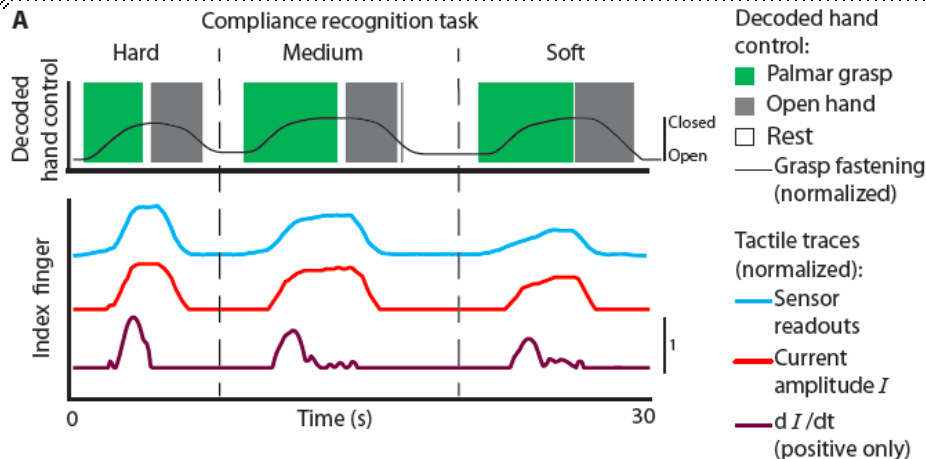
TIME electrodes



Test the possibility for the subject to use the sensory information during closed-loop control and manipulation experiments

Selection of grasping force levels

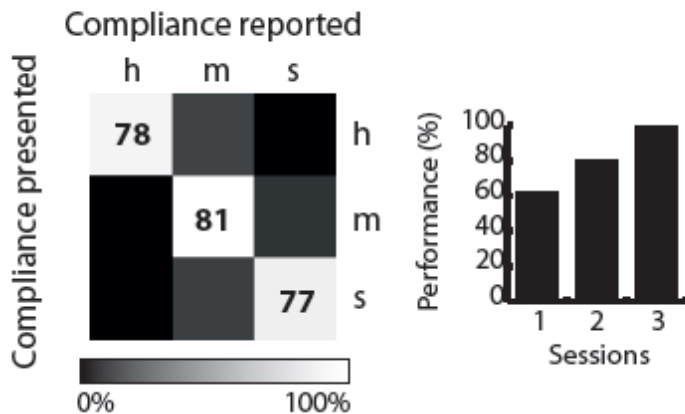


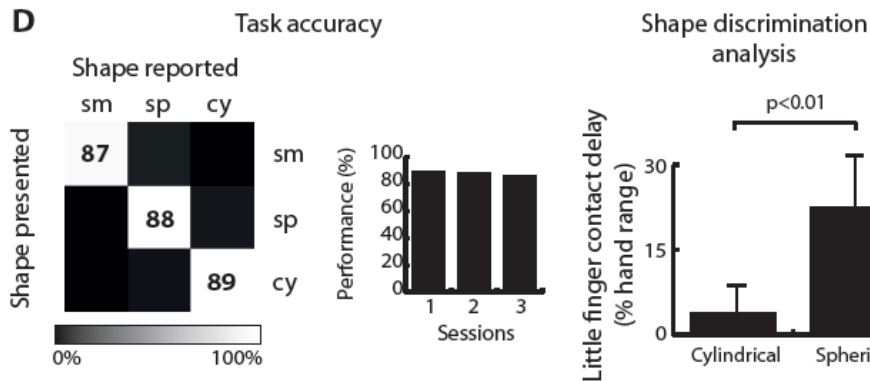
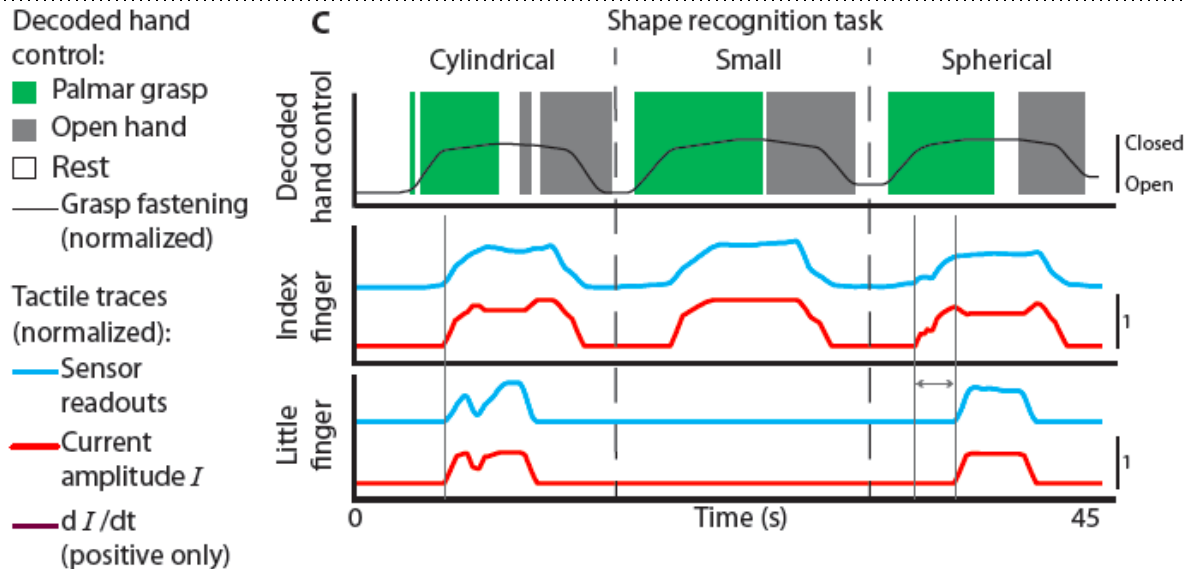


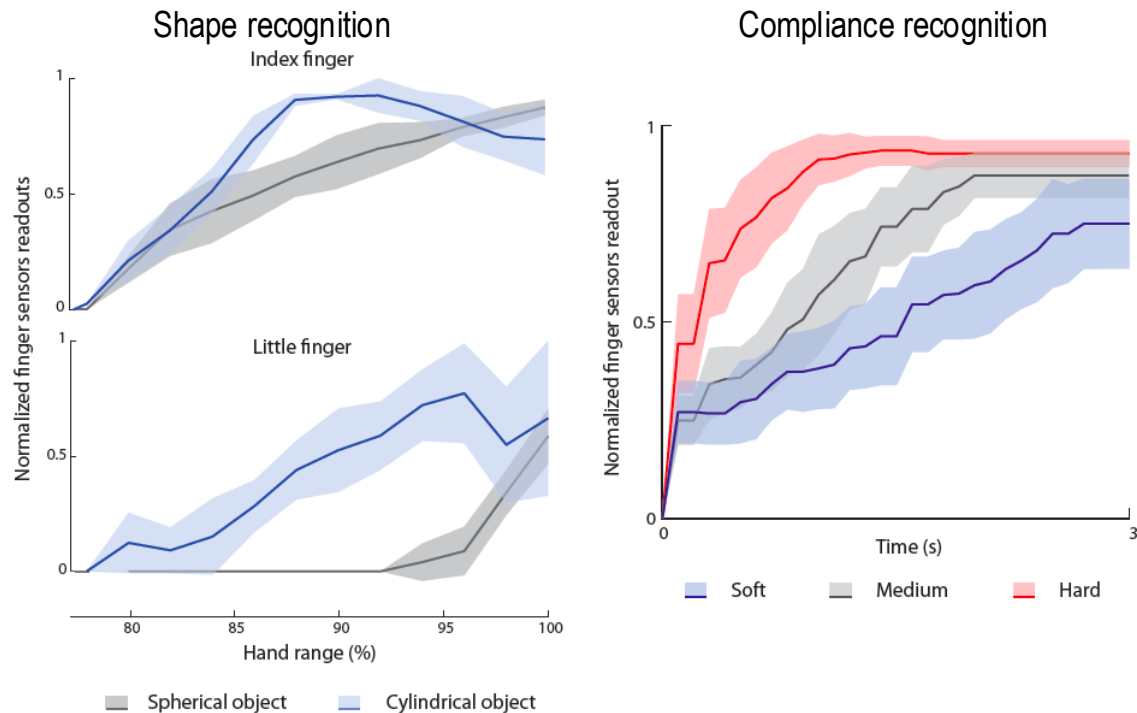
Three objects with different stiffness properties

Quite good performance and interesting learning ability

B Task accuracy

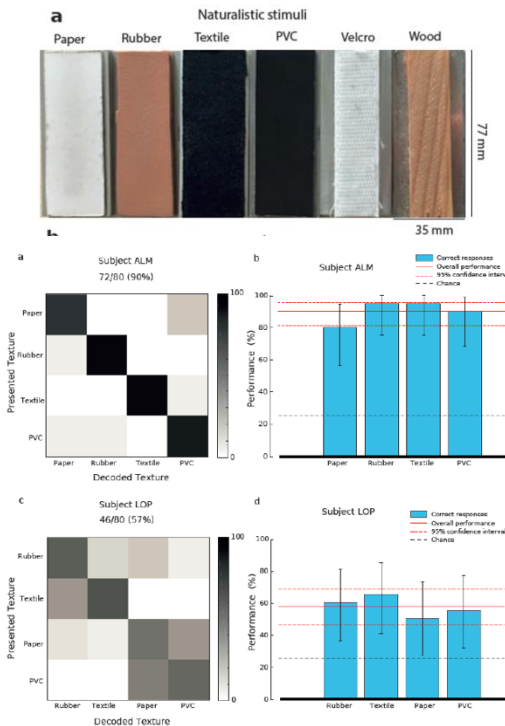
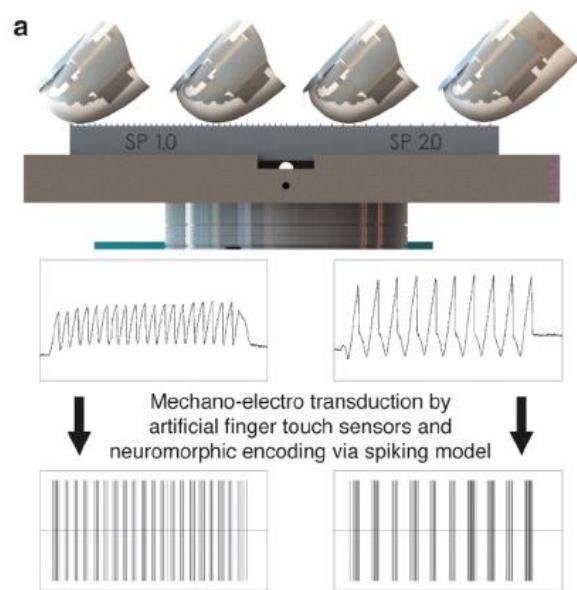
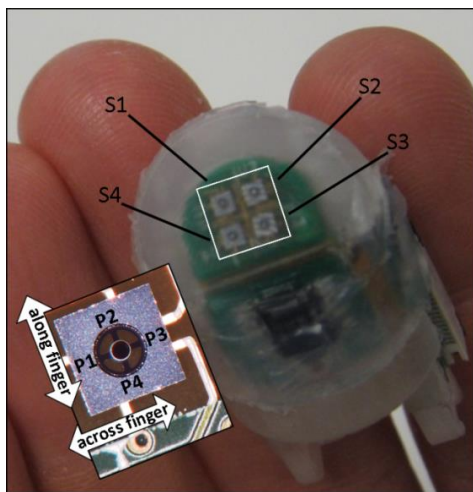




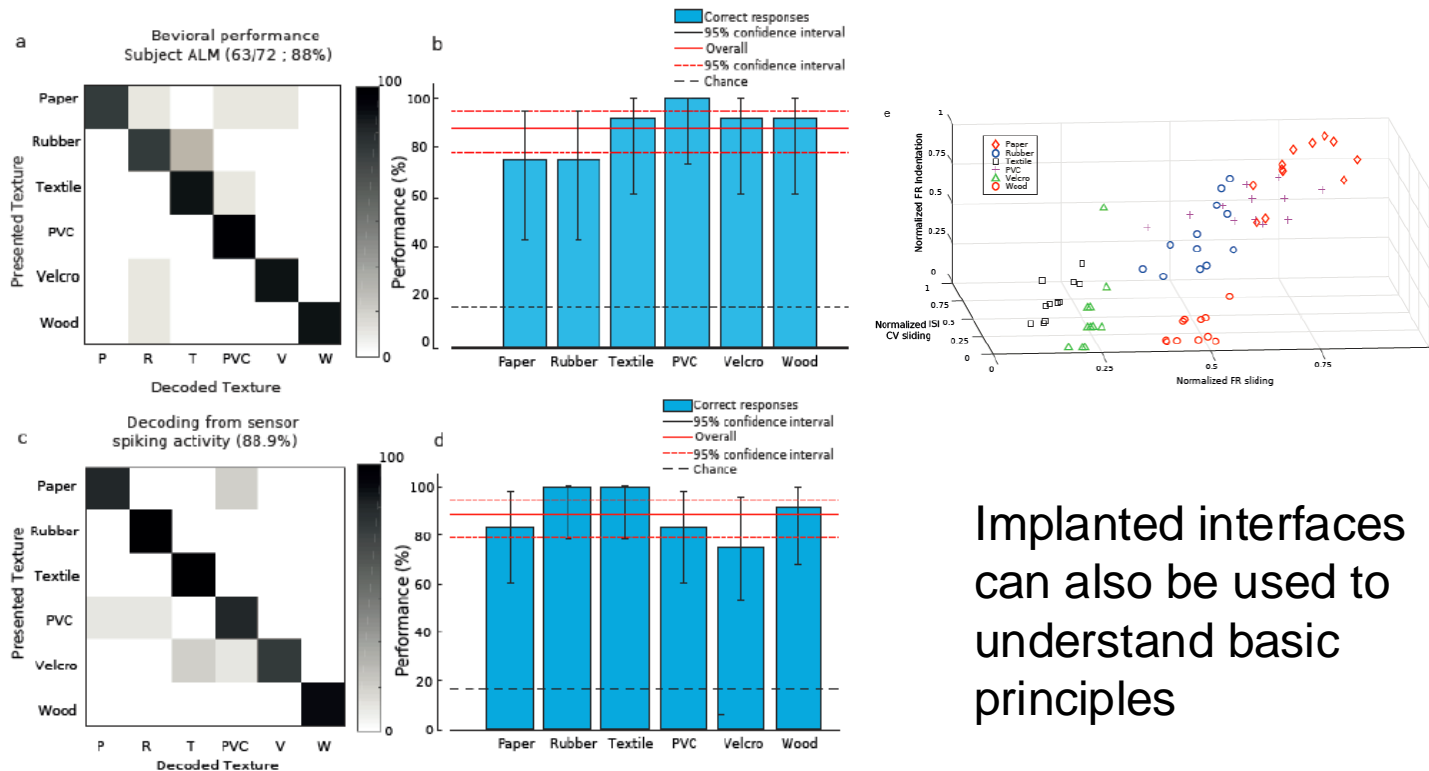


Different force profiles were provided to the users using the afferent stimulation
 → this is **NOT** on-off sensation!

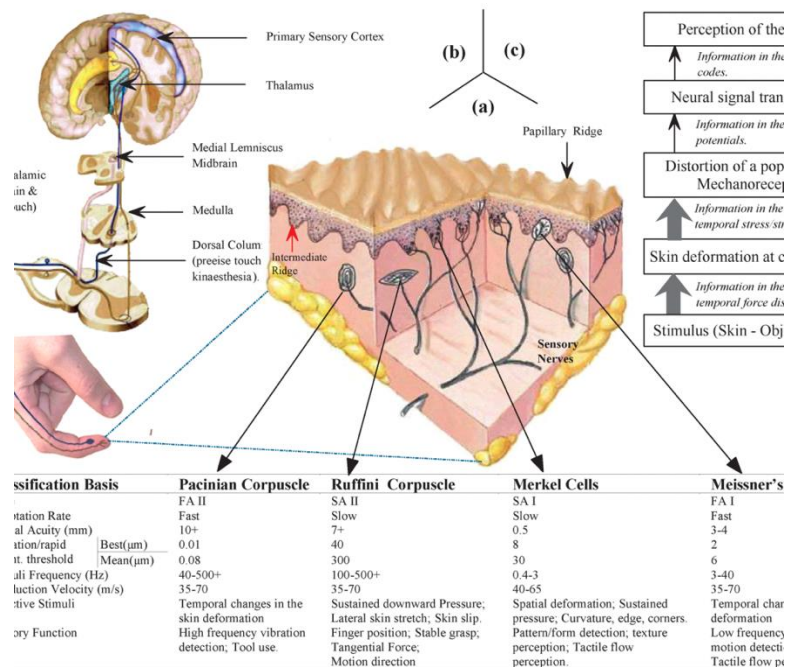
Detecting texture via FA-type stimulation



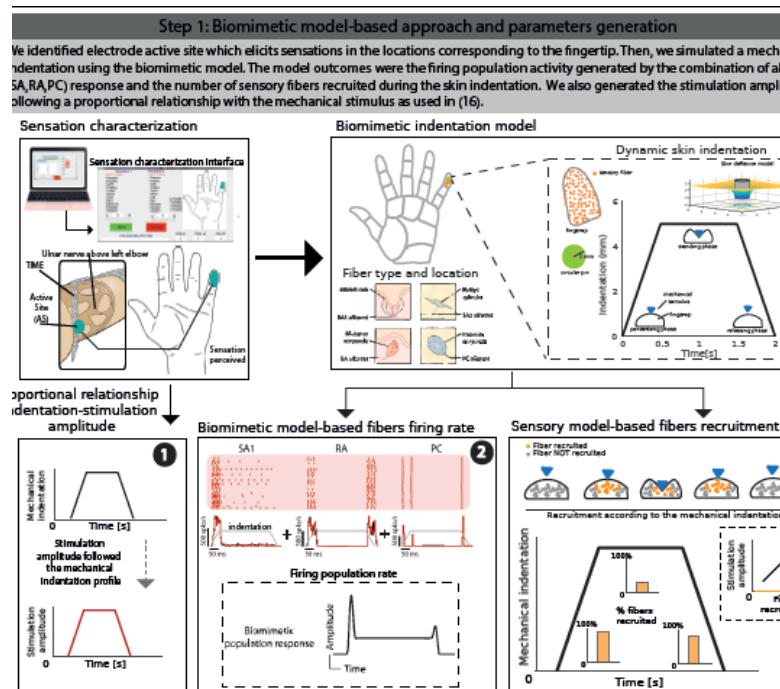
Restoring perception of real textures



Implanted interfaces
can also be used to
understand basic
principles



Biomimetic encoding strategy



Biomimetic encoding strategy

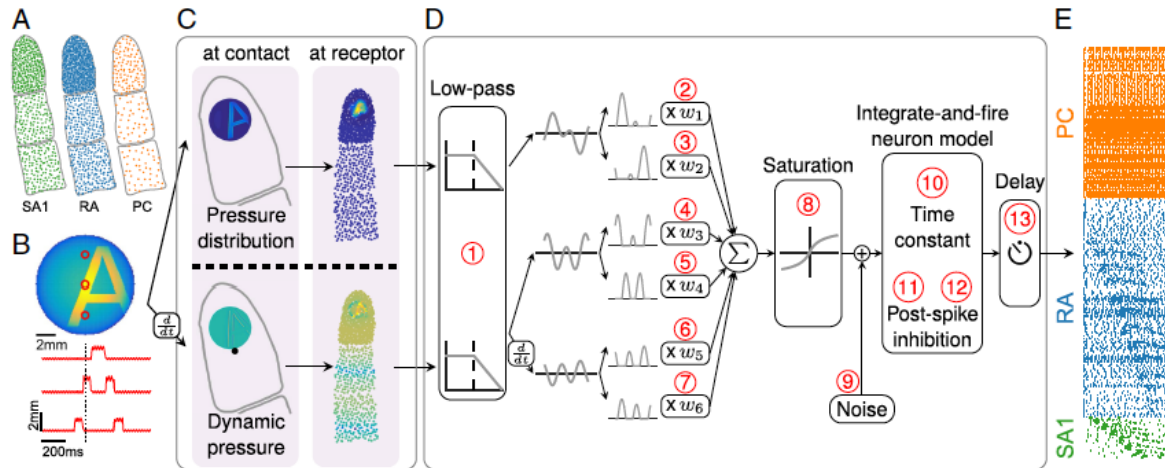
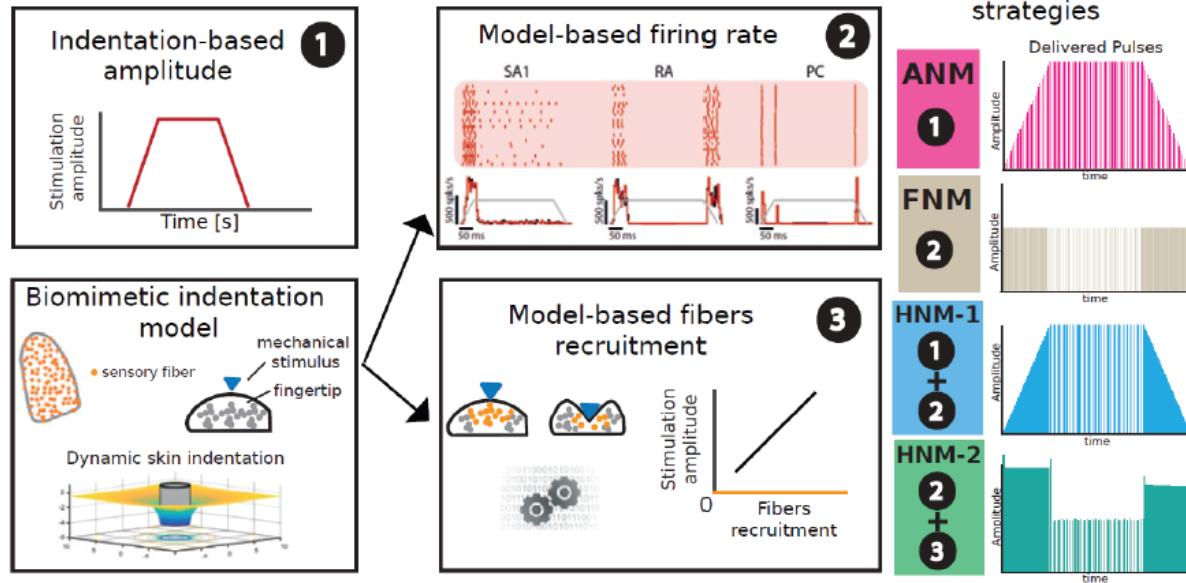
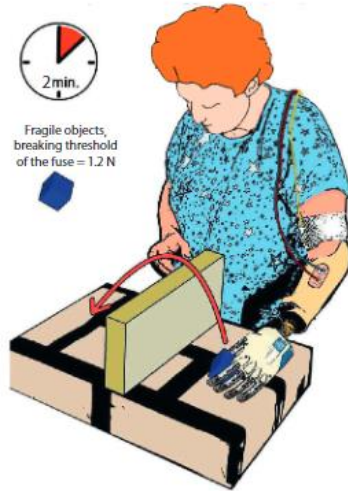


Fig. 1. Overview of the model. (A) Receptors are distributed across the skin given the known innervation densities of SA1, RA, and PC afferents. (B) The stimulus—in this case, a vibrating embossed letter A scanned across the skin—is defined as the time-varying depth at which each small patch of skin (here dubbed a pin) is indented (with a spatial resolution of 0.1 mm). The traces in *Lower* show the time-varying depth at the three locations on the skin indicated by the red dots in *Upper*. (C) The mechanics model relies on two parts: (*Upper*) modeling the distribution of stresses using a quasistatic elastic model and (*Lower*) modeling dynamic pressure and surface wave propagation. *Left* shows the surface deformation of the skin, and *Right* shows the resulting pattern of stresses at the location of the receptors. (D) The spiking responses are determined by leaky IF models using different sets of up to 13 parameters (marked in red numbers) for individual SA1, RA, and PC afferents fit based on peripheral recordings to skin vibrations. Adapted from ref. 71. (E) The output of the model is the spike train of each afferent in the population. Raster of the response of the afferent population sampled as in A to the stimulus shown in B (only active afferents are included). Note that the SA1s (in contact) only encode the spatial aspect of the stimulus, that the PCs encode from the whole finger phase-lock with the 200-Hz vibration, and that the RAs show mixed spatial and vibration responses.

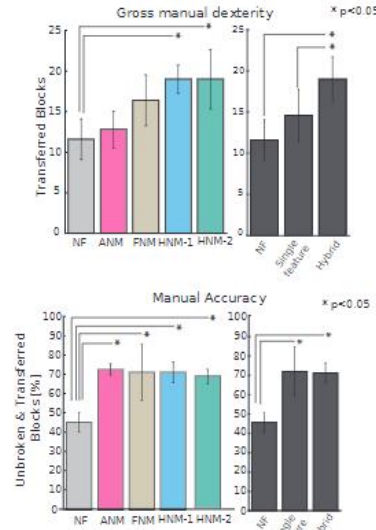


Biomimetic encoding strategy

A Setup - Virtual Eggs Test (VET) **B**

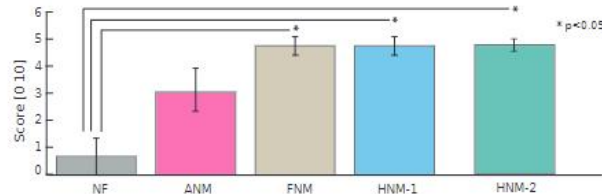


VET performance N=5



C

Naturalness perceived during VET N=5



The two hybrid models are better to perform the virtual egg task.

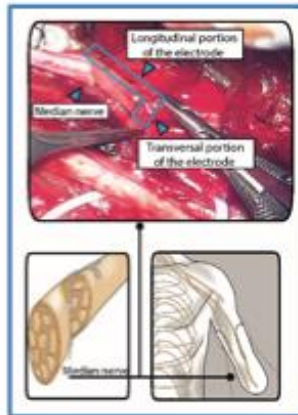
The biomimetic approaches were judged more natural



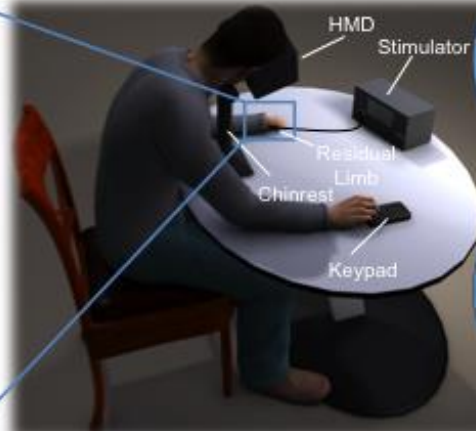
O. Blanke

G. Rognini

Neurotactile stimulation



Illumination and virtual stimuli as shown on HMD



Patient 1
(artificial hand)



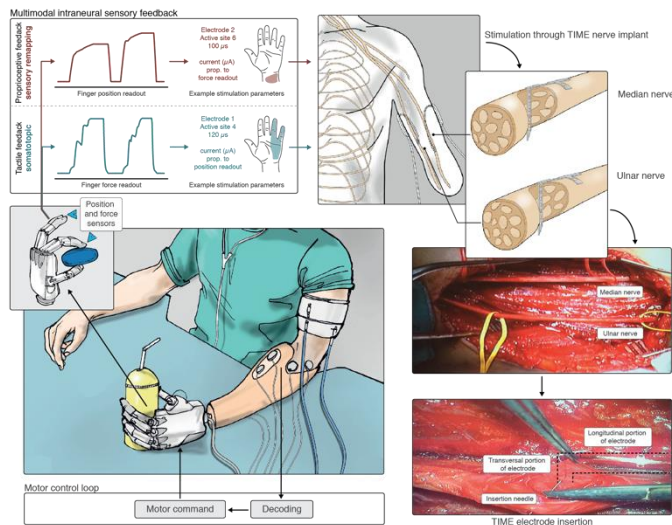
Patient 2
(prosthetic hand)



Rognini, Giulio, et al. "Multisensory bionic limb to achieve prosthesis embodiment and reduce distorted phantom limb perceptions." *Journal of Neurology, Neurosurgery & Psychiatry* 90.7 (2019): 833-836.

Bidirectional neurocontrolled hand prostheses

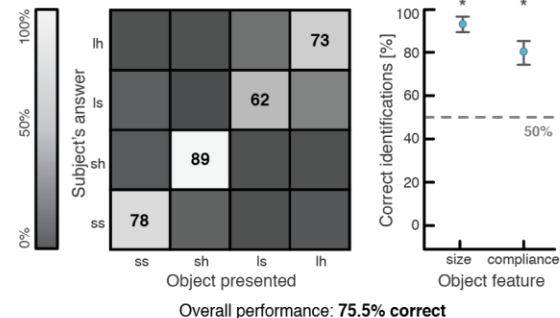
"Multimodal" sensory feedback



a Experimental setup

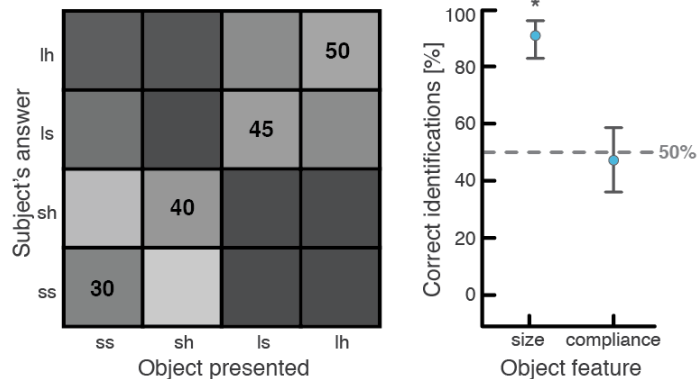


b Task performance with touch and proprioception (n=2)



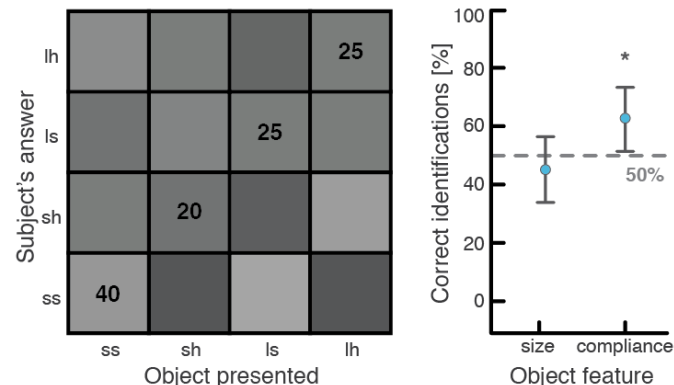
Restoration of proprioception and tactile feedback

c Proprioception only control condition (n=1)

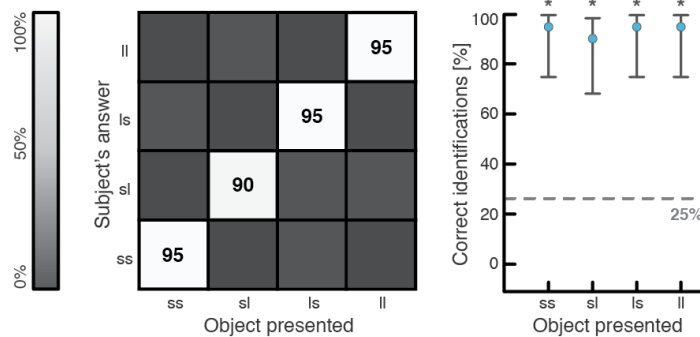


Overall performance: **41.3% correct**

e Touch only control condition (n=1)

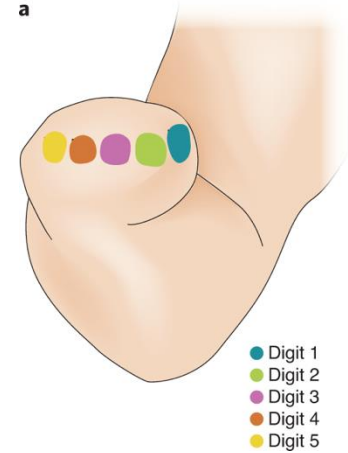
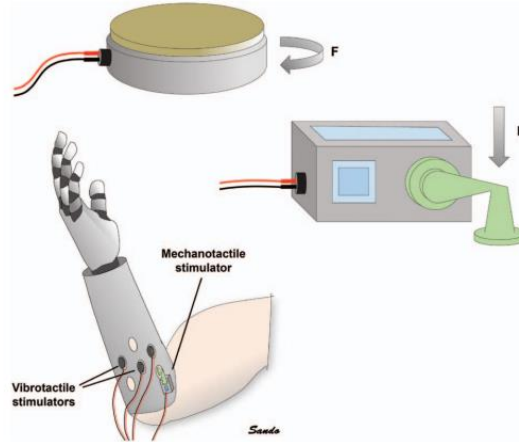
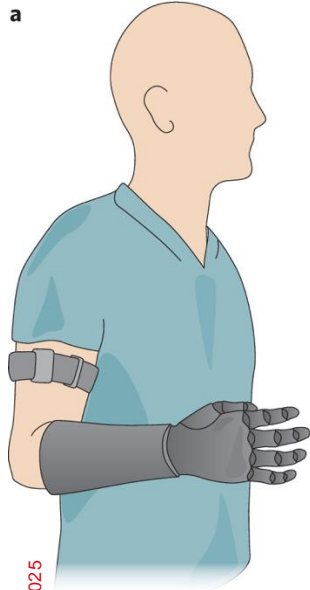


Multi-joint proprioception task (n=1)



Overall performance: **93.7% correct**

Tactile feedback via non-invasive solutions



Tactile feedback via non-invasive solutions

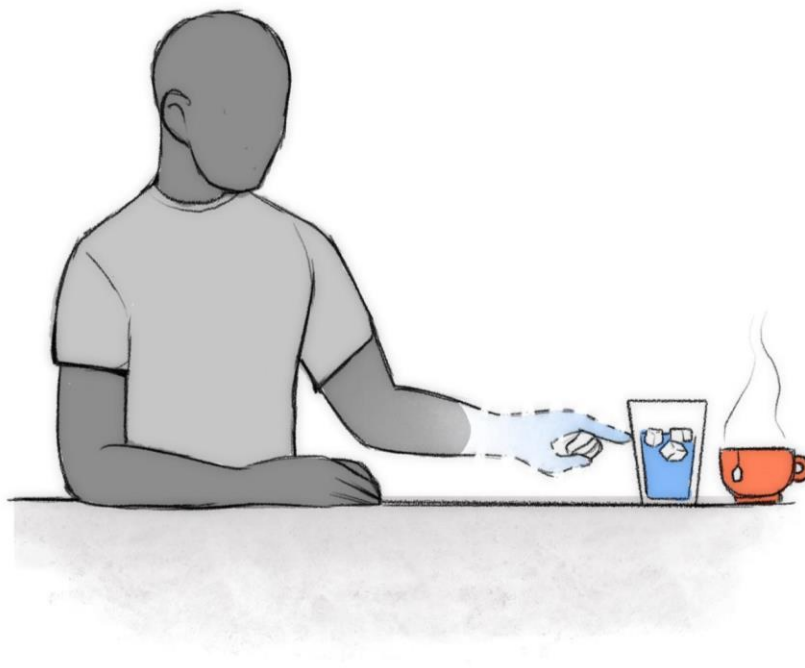
a

Can we **exploit** phantom sensations to provide **thermal** information?



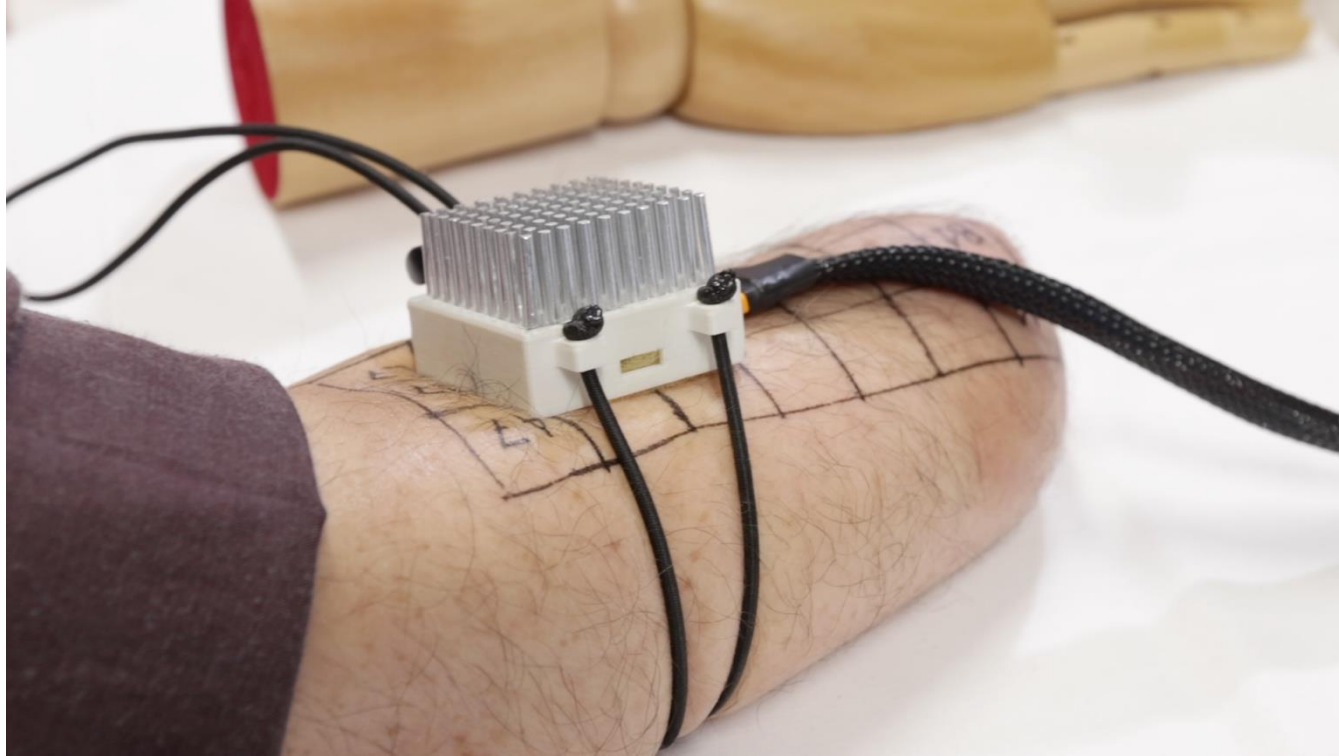
● Digit 4
● Digit 5

Why thermal feedback?

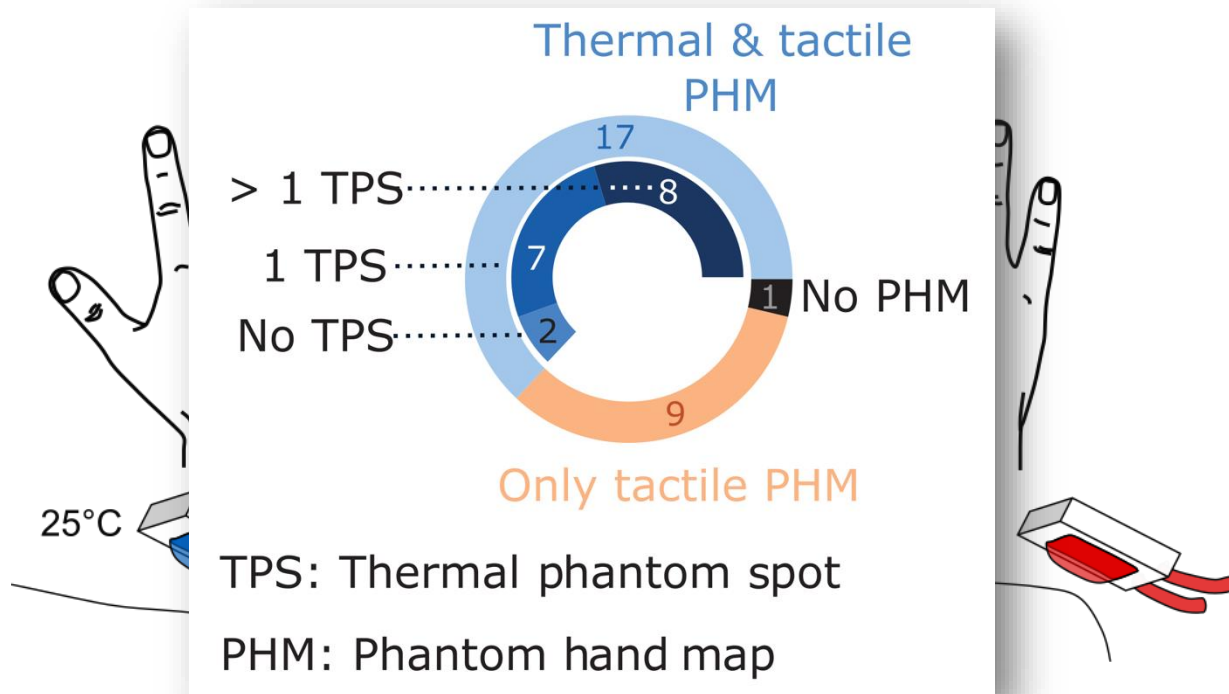


- Convey thermal information
 - Cold, warm, dangerously hot
- More complex modalities:
 - **Material** detection
 - **Moisture** detection
 - Contact with a **body**
- **Social** and **affective** aspects of touch

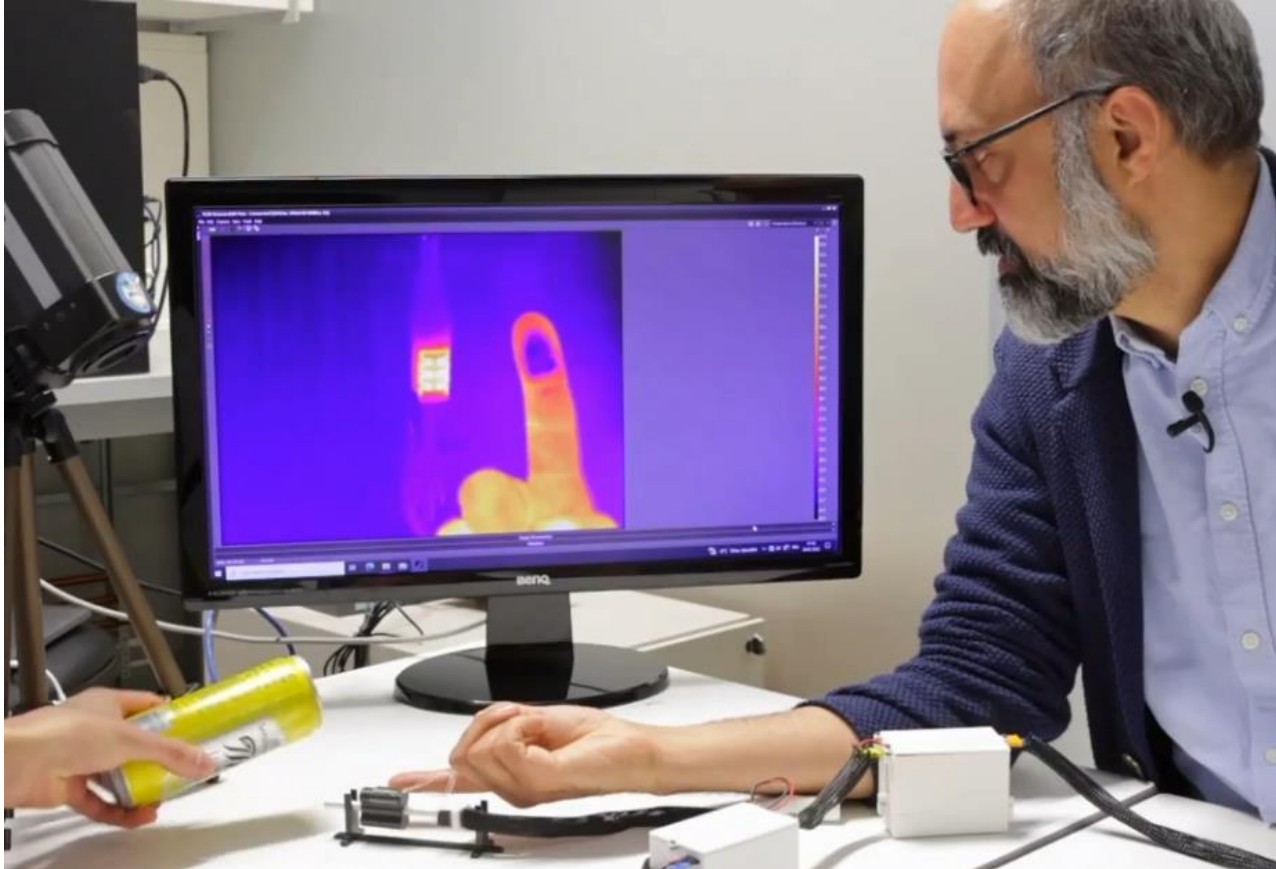
Phantom tactile and thermal maps



Phantom tactile and thermal maps

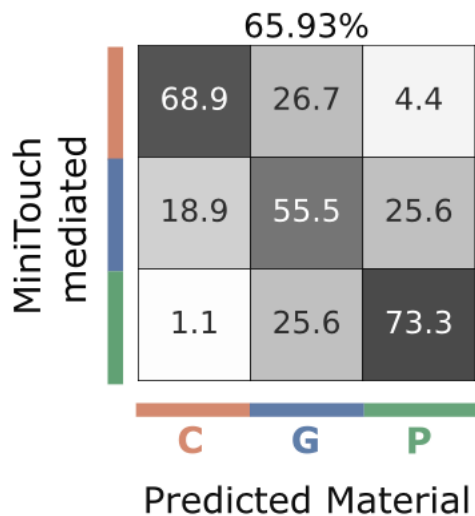


Wearable solution

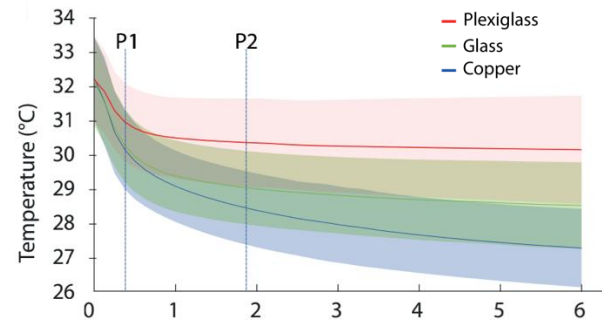
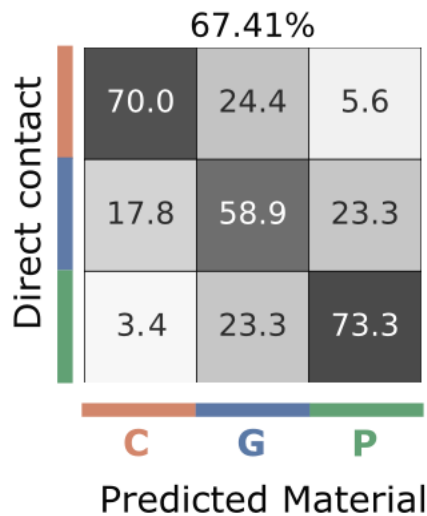


Material detection

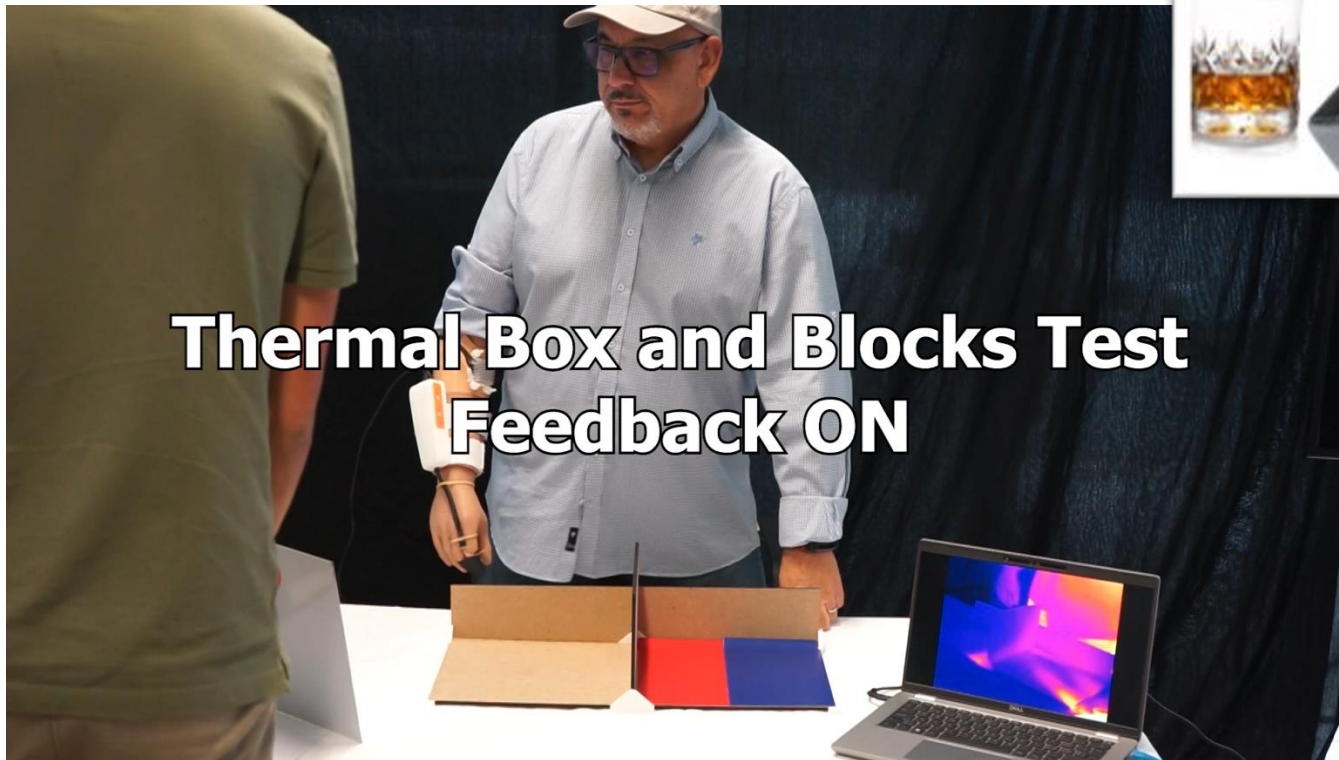
i Thermal Phantom Spot



Intact Hand

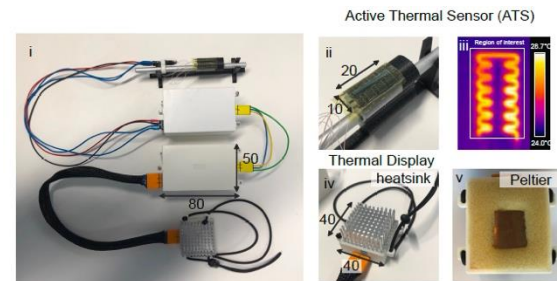
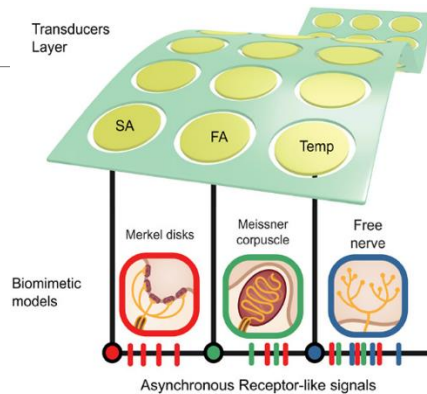
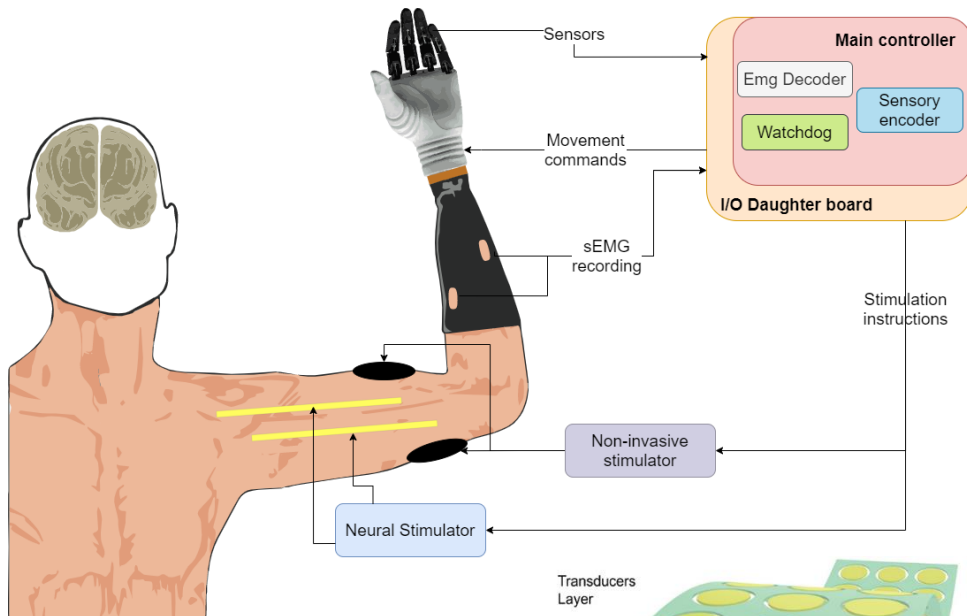


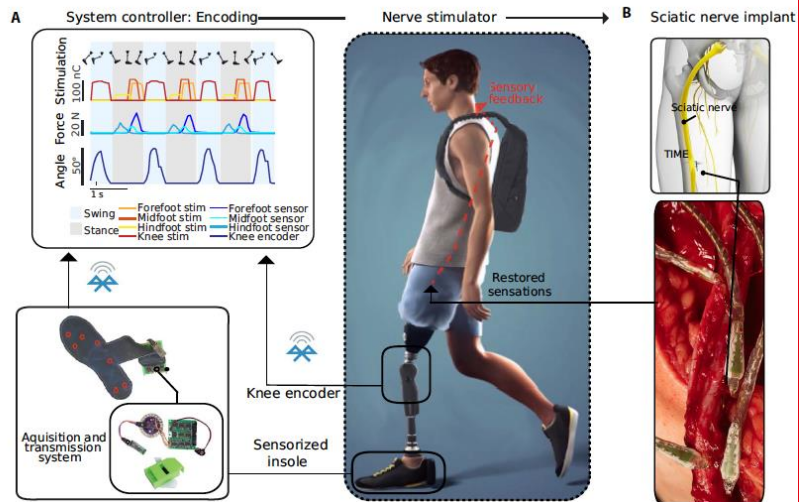
Sensory motor tasks with real-time feedback



**Thermal Box and Blocks Test
Feedback ON**

NEXT STEP – Going chronic at home





Lower limb bionics

Bidirectional neurocontrolled leg prostheses



Above the knee

Below the knee

Leg Prosthetics

Utah Bionic Leg

Powered Knee Module

Weight: 1.6 kg
Range of Motion: 120 deg
Max Torque: 150 Nm
Max Speed: 500 deg/s
Build Height: 255mm

Standard Connection

Allows adjustment of prosthesis build height and ankle inversion/eversion to patient using standard prosthetic components

Powered Ankle-Toe Module

Weight: 1.6 kg
Range of Motion - Ankle: 40 deg
Range of Motion - Toe: 45 deg
Max Torque: 150 Nm
Max Speed: 350 deg/s
Build Height: 165 mm



Passively Variable Transmission

Continuously changes the motor gearing based on the applied load to optimize motor function and battery life

Lithium-Ion Battery

Enables combined 12,800 steps on level ground and 40 flights of stairs on a single charge, or hybrid mode allows for indefinite activity with battery regeneration during walking

Artificial Sensing and Control

Embedded computers and sensors execute control loops up to 2,000 times per second to optimize the prosthesis behavior based on the user's movement

Carbon Fiber Foot Case

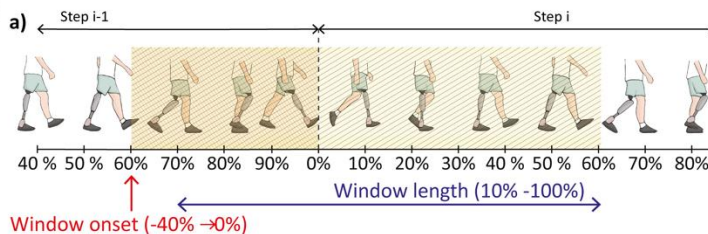
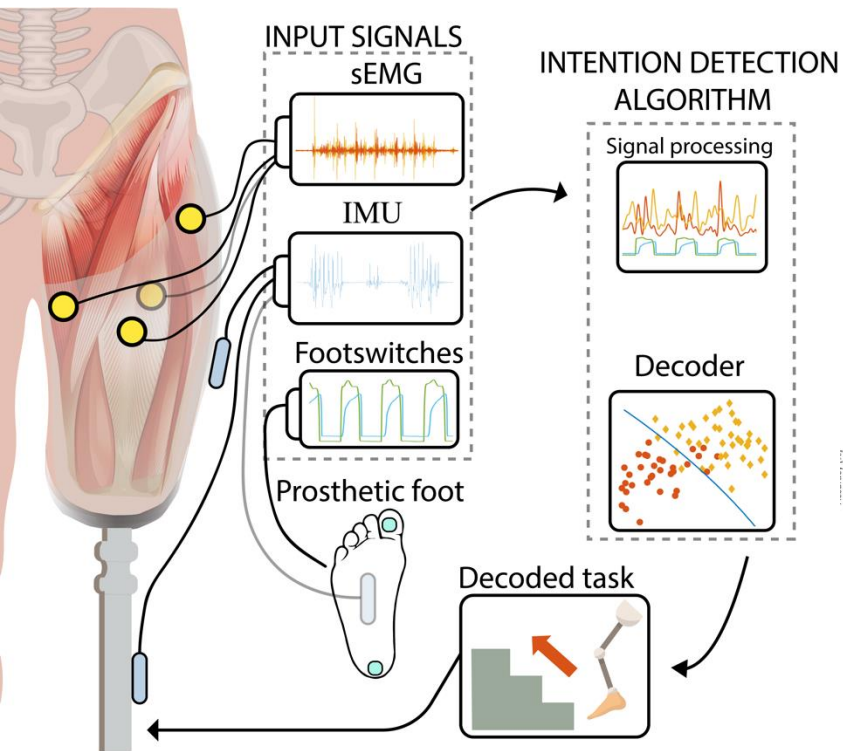
A lightweight, high strength carbon fiber foot shell contains the electromechanical actuation system

Bioinspired Artificial Tendon

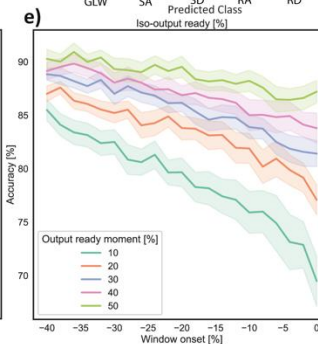
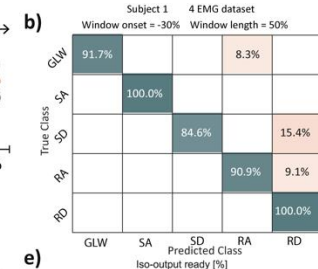
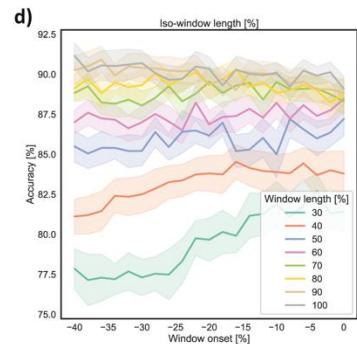
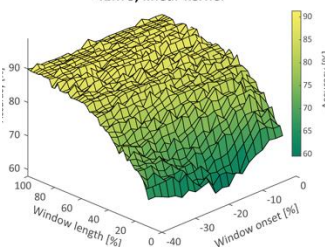
An artificial tendon connects the toe and the ankle joint to allow for biomimetic foot mechanics during walking



Bidirectional neurocontrolled leg prostheses

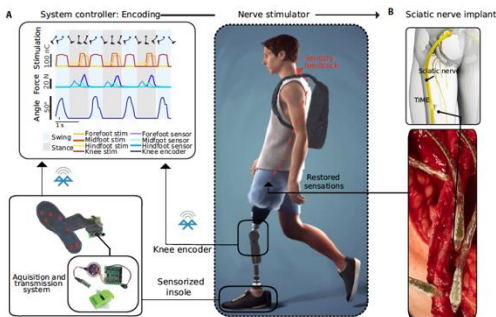


c) Classifier accuracy = $f(\text{window length, window onset})$
4EMG, linear kernel



Bidirectional neurocontrolled leg prostheses

Sensory feedback



Enhancing functional abilities and cognitive integration
of the lower limb prosthesis

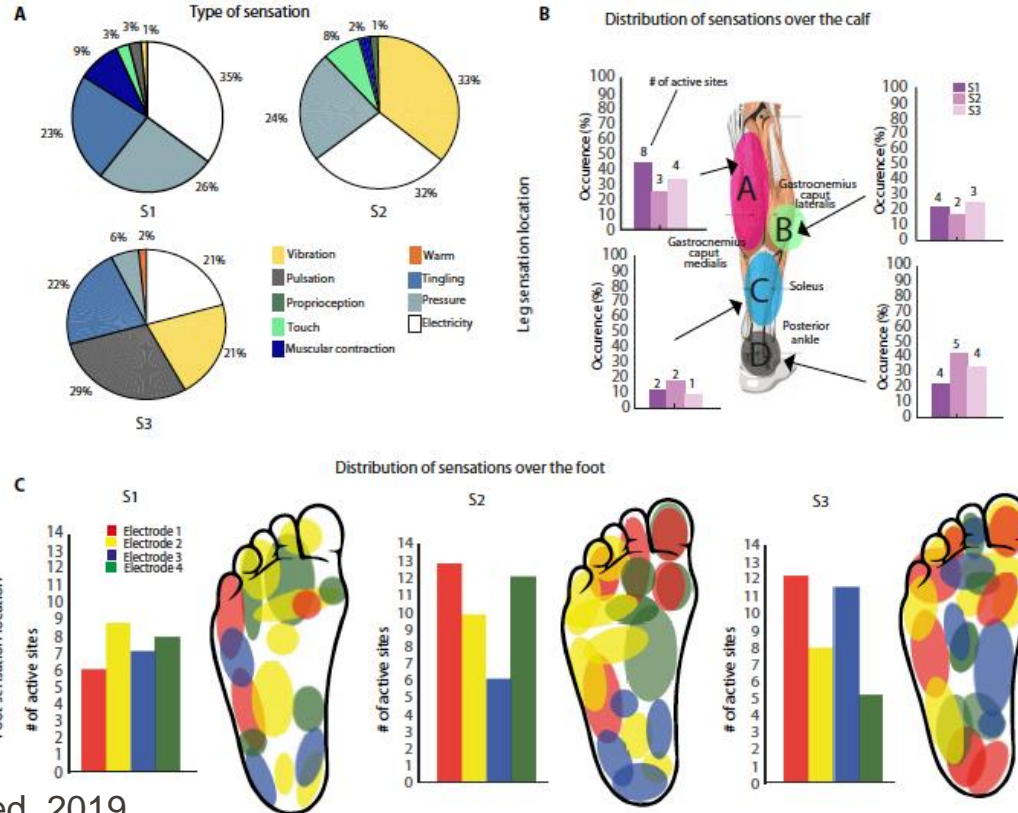
Movie S2:

Neuroprosthesis working
principle and active tasks

Caution: Investigational device

Bidirectional neurocontrolled leg prostheses

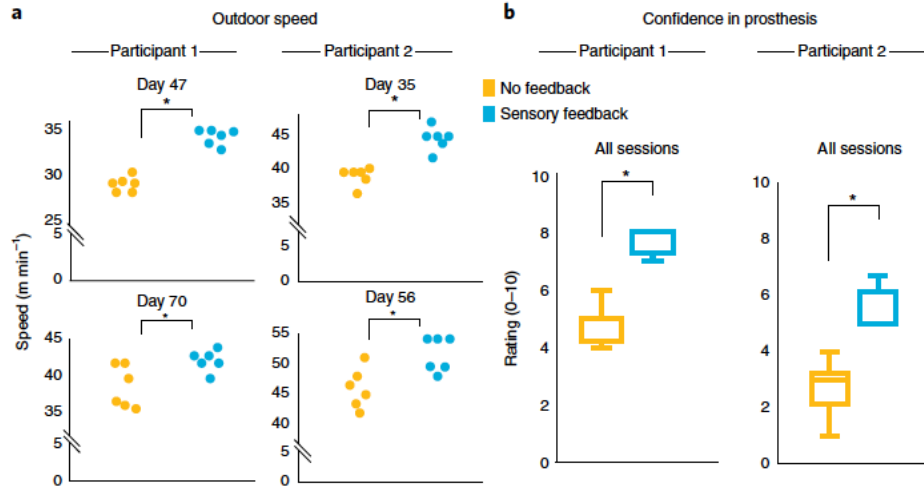
Sensory feedback



Petrini et al.,
Science Trans Med, 2019

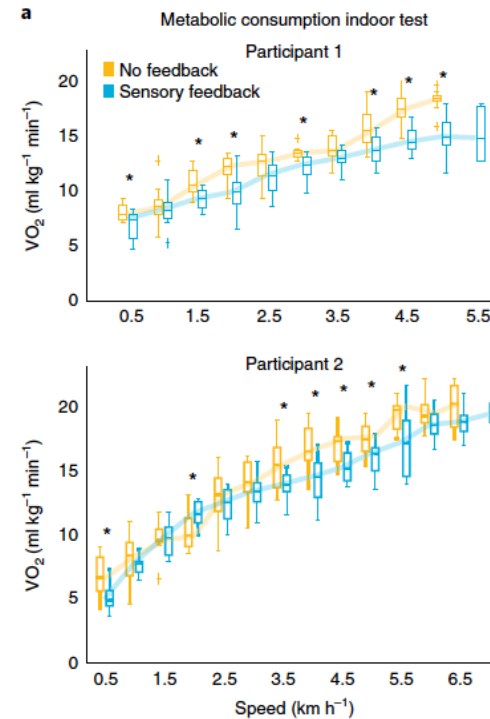
Bidirectional neurocontrolled leg

Sensory feedback



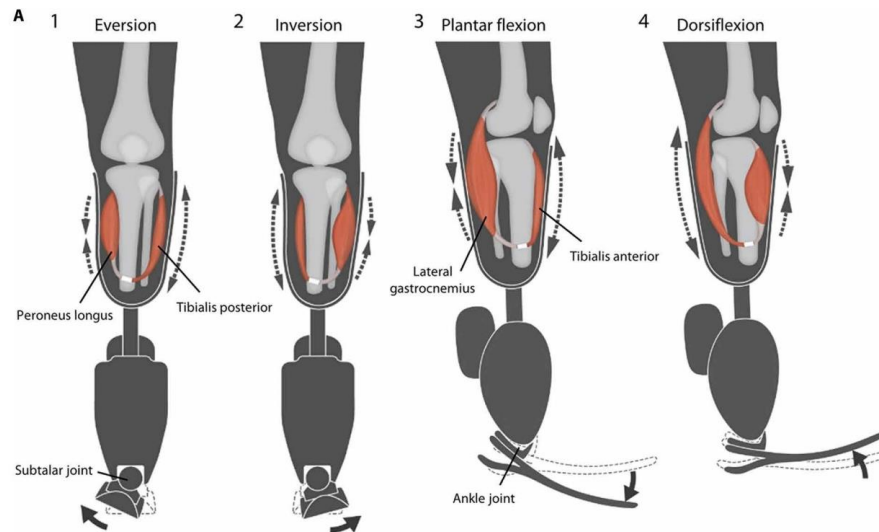
Walking speed and self-reported confidence increased while mental and physical fatigue decreased for both participants

Participants exhibited reduced phantom limb pain with neural sensory feedback.



Agonist-antagonist myoneural interface

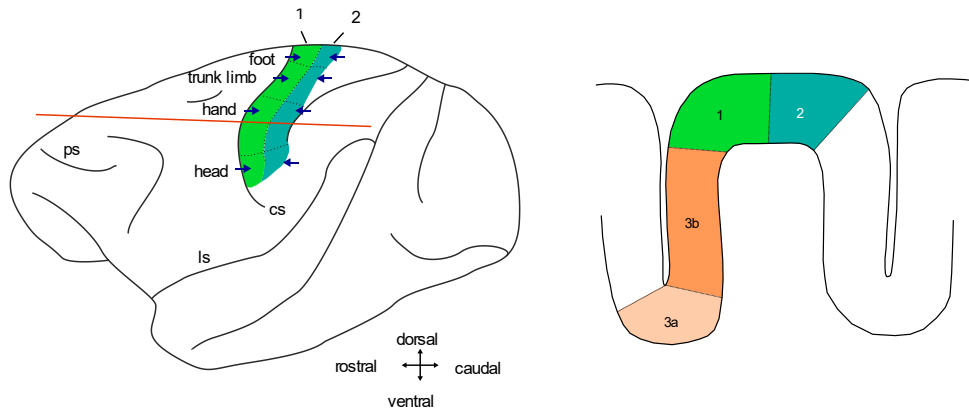
- As a methodology of improving efferent (neural pathways that relay commands from the central nervous system to a muscle or other end organ) prosthetic control and providing afferent proprioceptive sensation, we present an agonist-antagonist myoneural interface (AMI)
- An AMI is made up of an agonist and an antagonist muscle tendon connected mechanically in series: When the agonist contracts, the antagonist is stretched and vice versa
- The purpose of an AMI is to control and interpret proprioceptive feedback from a bionic joint.





Sensory feedback via brain stimulation

Cortical anatomical organization for Primary Somatosensory Cortex (NHP)

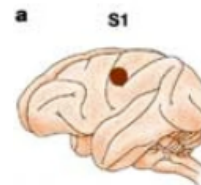
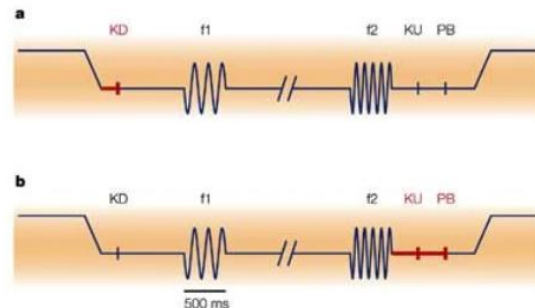


- Neurons in area 3a respond primarily to joint movements. Proprioceptive afferents are multimodally processed in this region.
- Neurons in areas 3b and 1 respond to light touch. Phase-locked responses to vibrations are primarily seen in area 3b, they gradually disappear in area 1 and area 2.

cs: central sulcus; ips: intraparietal sulcus; pcd: precentral dimple; asu: arcuate sulcus; ps: principal sulcus; ls: lateral sulcus; BA: Brodmann area. Modified from (James et al., 2007; Pons et al., 1985, 1987).

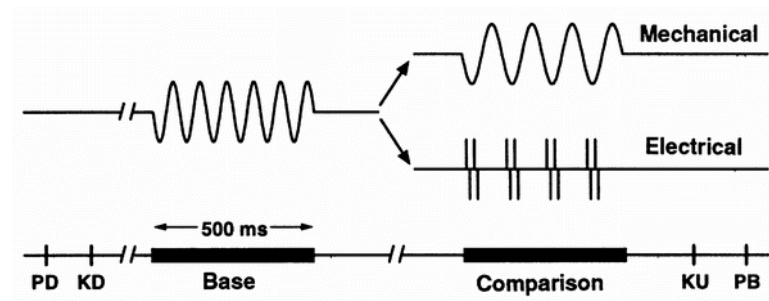
Sensory feedback cortical mechanisms

- Test with nonhuman primates (NHP) showed that the sensation of flutter is produced with mechanical vibrations in the range of 5–50 Hz
- The stimulus activates neurons in S1 that somatotopically map to the site of stimulation.
- A subset of neurons in area 3b— those with quickly adapting properties— are strongly entrained by periodic flutter vibrations, firing with a probability related to the input frequency
- Hence, quickly adapting neurons provide a dynamic representation of such flutter stimuli.

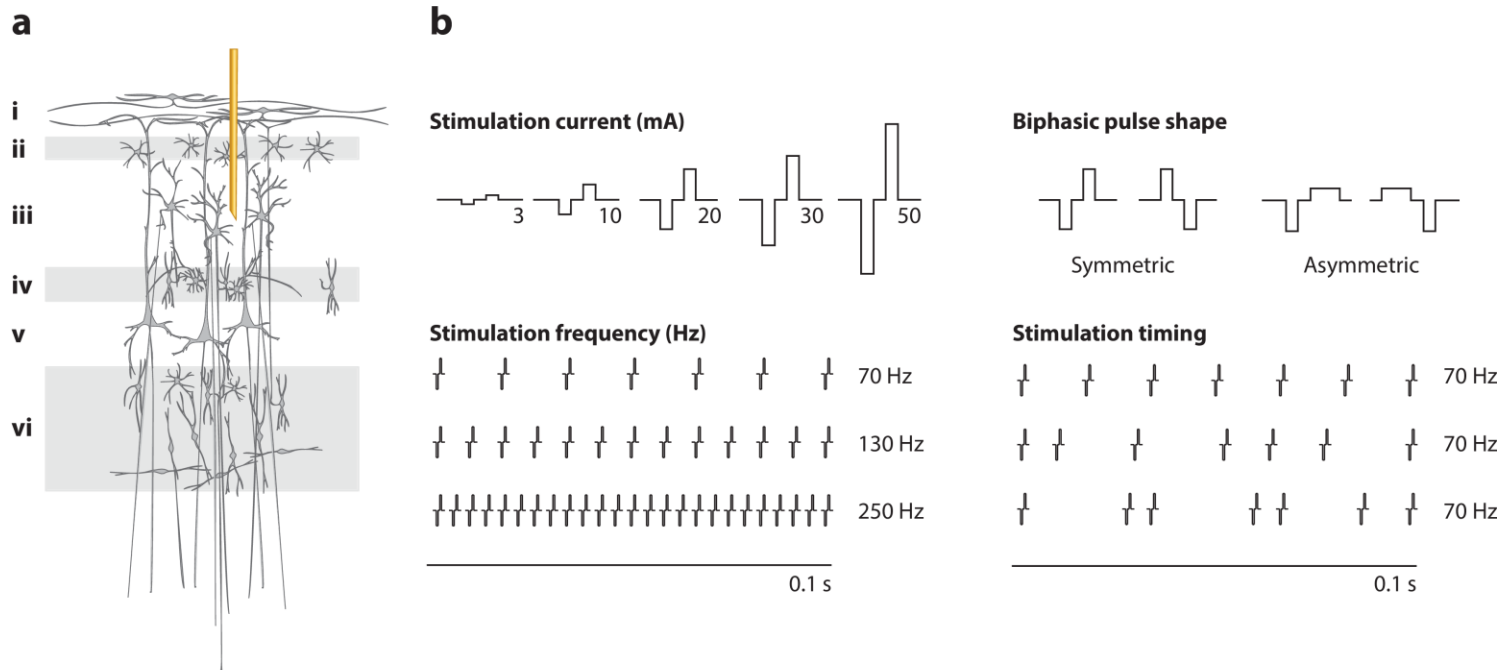


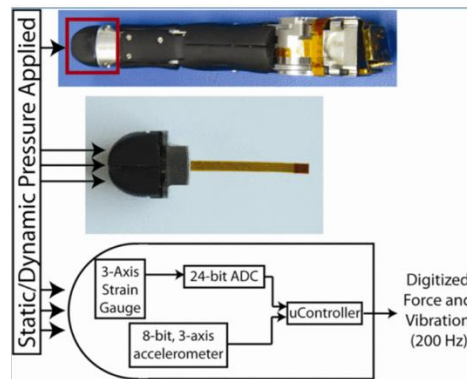
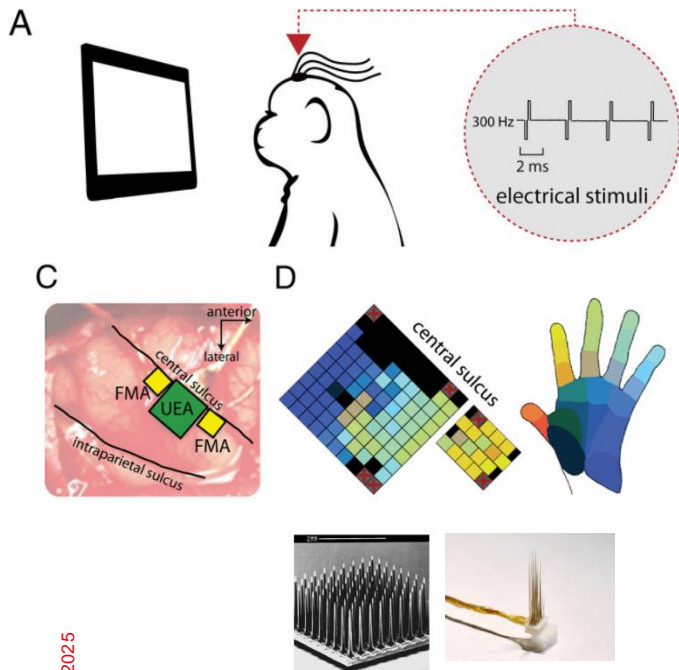
Intracortical micro stimulation

- **Method:**
 - Microelectrodes implanted into area 3b of S1
 - Biphasic current pulses (lasted 0.2 ms, with 0.05 ms between phases), amplitude 65 μ A and 100 μ A
- **Results:** Animals reliably indicated whether electrical signal was higher or lower than that the mechanical signal
- **Conclusion:** the neural code underlying the sensation of flutter can be manipulated.

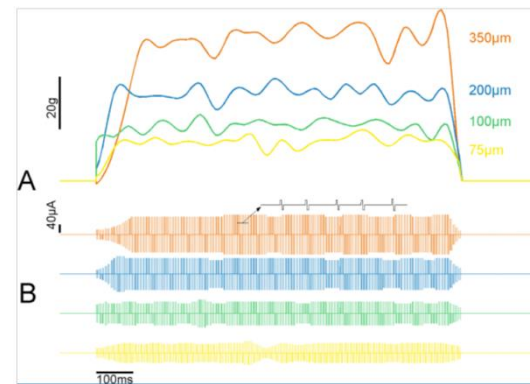


Cortical anatomical organization for Primary Somatosensory Cortex (NHP)



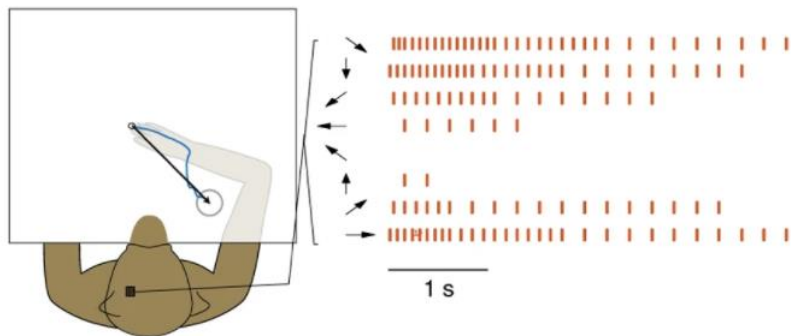


Pressure sensors on the finger-tip of a prosthetic hand

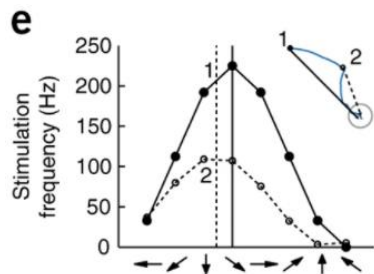


Conversion from time-varying force to ICMS pulse trains of varying amplitude. (A) Time-varying force output of the prosthetic finger on four detection trials with four different amplitudes. (B) Resulting electrical stimulation pulse trains

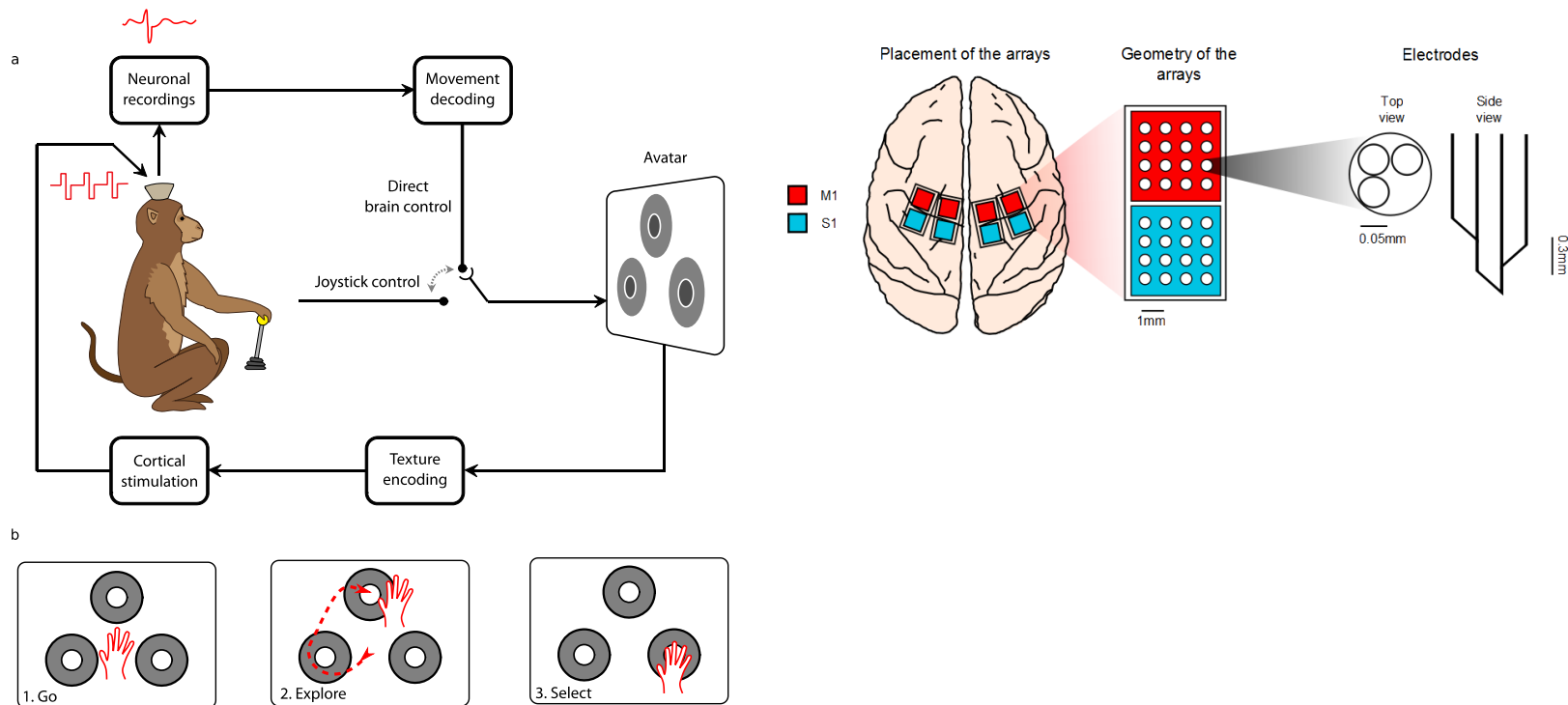
Sensory encoding using a learning-based ICMS approach



- Stimulation on 8 electrodes.
- Non-biomimetic approach, but rather a learning-based approach
 - Spatiotemporal correlations between a visual signal and novel artificial signal in a behavioral context would be sufficient for a monkey to learn to integrate the new modality.
- Provide continuous information about the hand state during reaching via ICMS
- **Result:** artificial kinesthetic feedback can be efficiently learned by the monkey and can provide rich insights for directing movements.



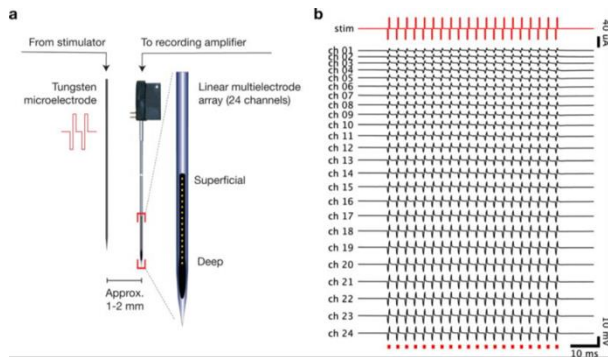
Bidirectional brain machine interface



Stimulation paradigm

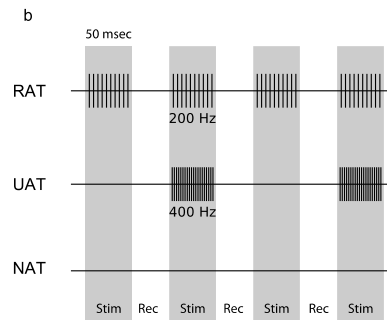
Problem

Complex signal artifact during the stimulation periods -> corrupts the signals recorded in the motor cortex

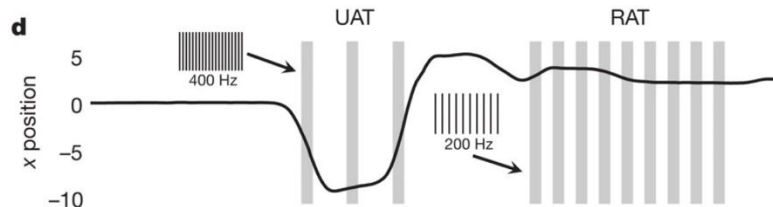


Solution (for this study):

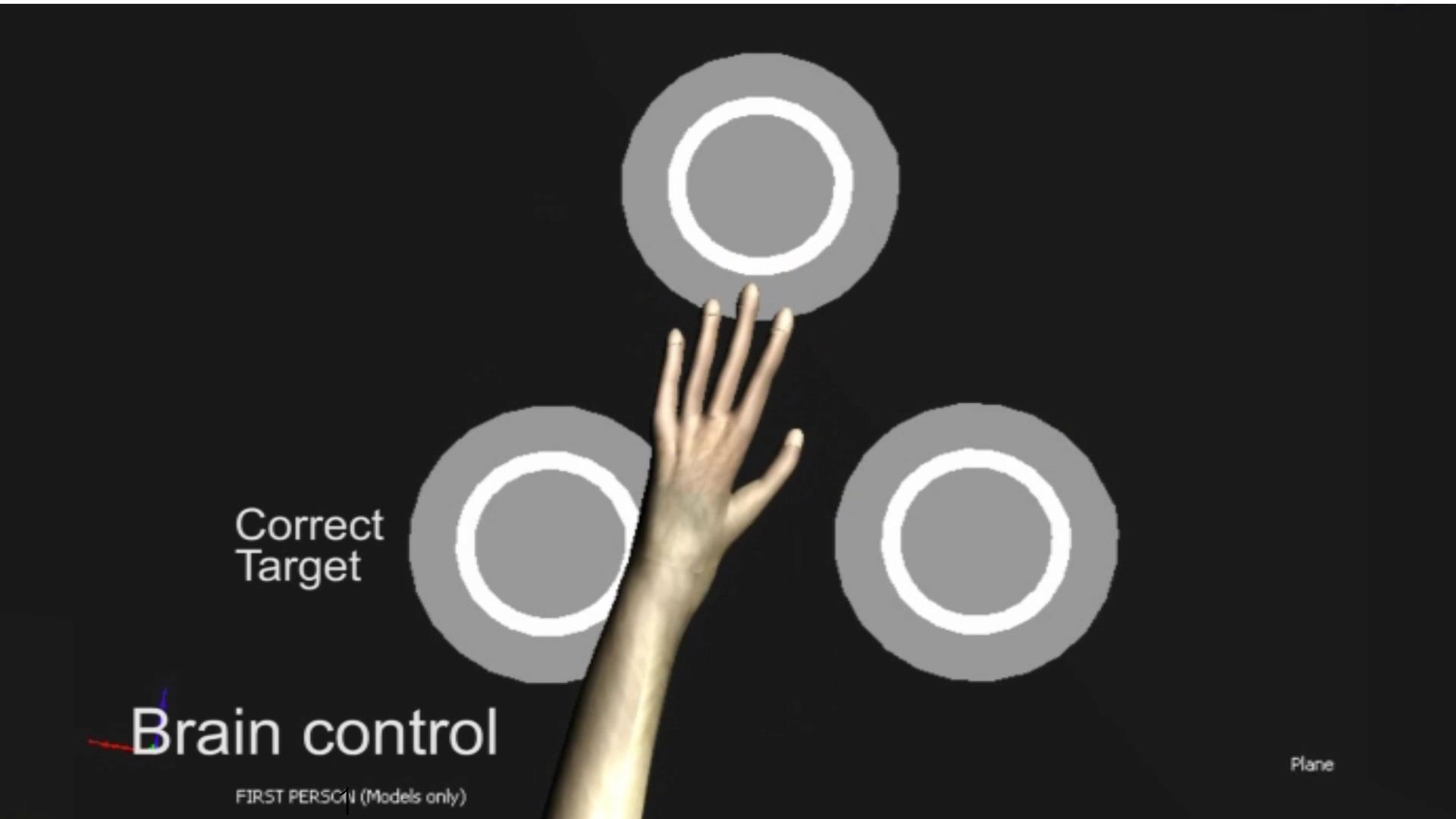
Multiplexing of sensory encoding and motor decoding periods



Encoding of the rewarded the unrewarded and null artificial textures



O'Shea, D. J., & Shenoy, K. V. (2018). ERAASR: an algorithm for removing electrical stimulation artifacts from multi-electrode array recordings. *Journal of neural engineering*, 15(2), 026020.

A hand is shown reaching upwards towards a target. The target is a white circle with a thick border, surrounded by a larger gray circle. There are two other similar targets, one to the left and one to the right. The background is black.

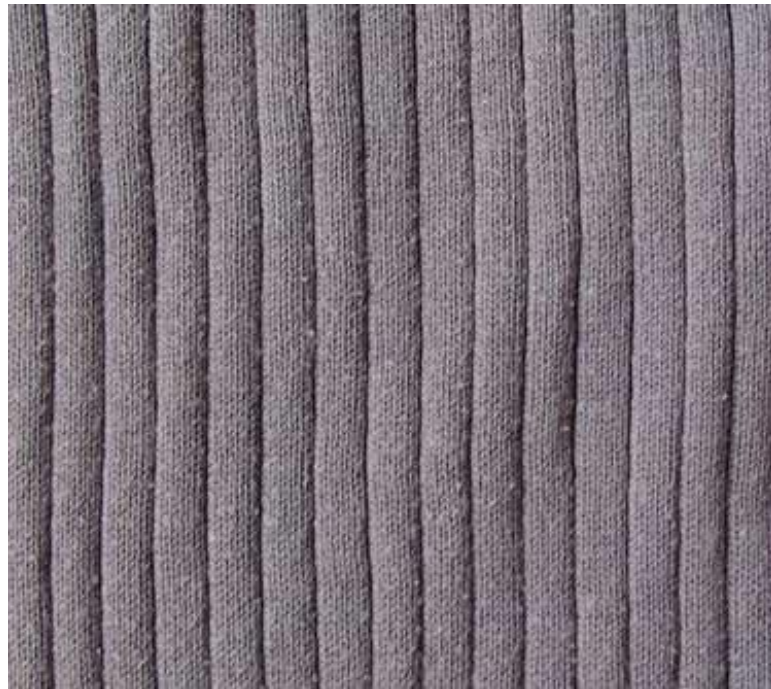
Correct
Target

Brain control

FIRST PERSON (Models only)

Plane

Texture perception



monkey view

experimenter view



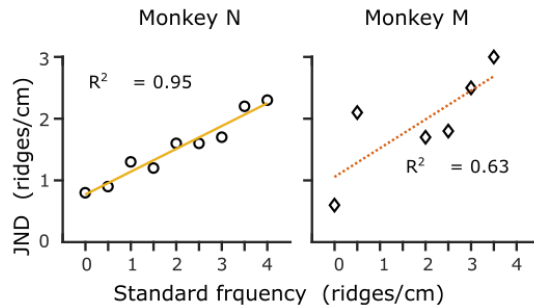
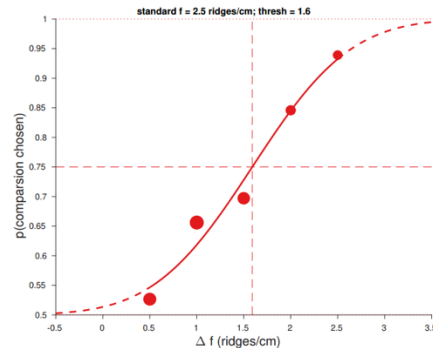
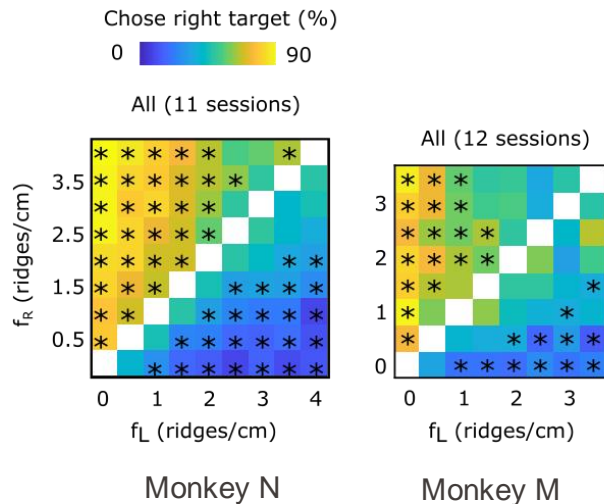
Note: microstimulation artifact NOT audible to monkey

Active tactile exploration of textures: results

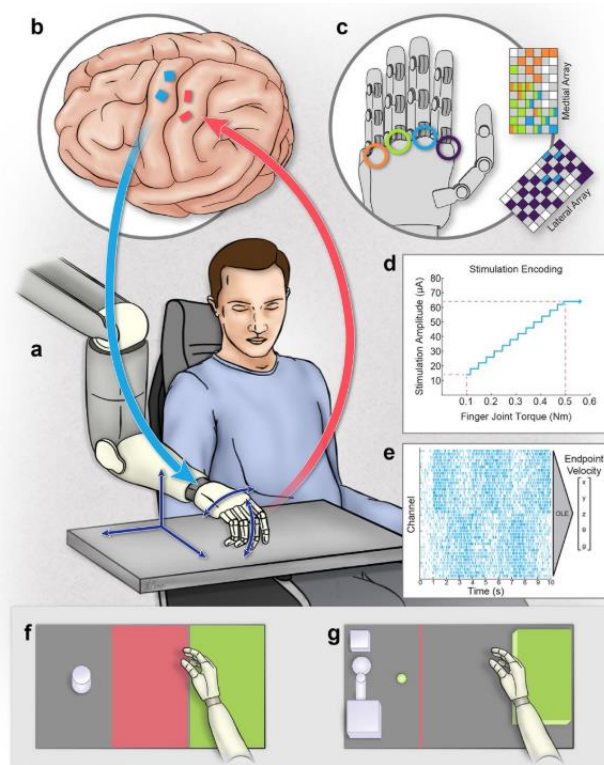
Monkeys discriminated spatial gratings based on self-generated temporal ICMS

Psychometrics analysis of Just noticeable difference (JND)

JND increases proportionally to f , consistent with the Weber–Fechner/Steven’s law



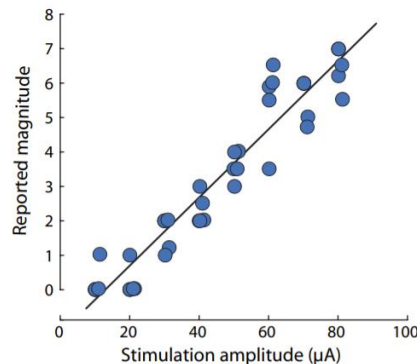
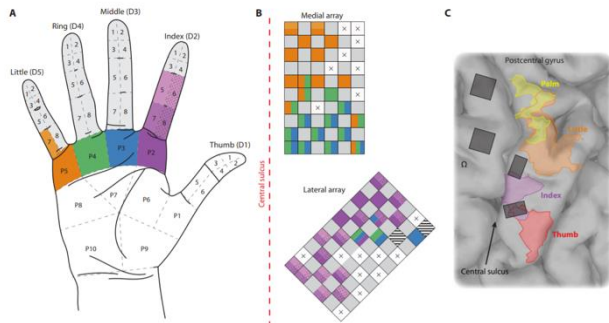
Clinical test with implanted electrodes in Tetraplegic patients



Patient:

- A 28-year-old male participant with tetraplegia
- Two microelectrode arrays implanted in area 1 of S1
- Electrode implanted in M1 as part of a larger protocol

How does it feel ?

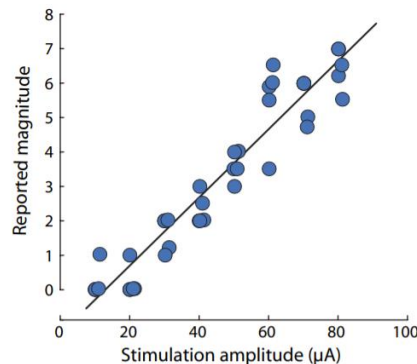
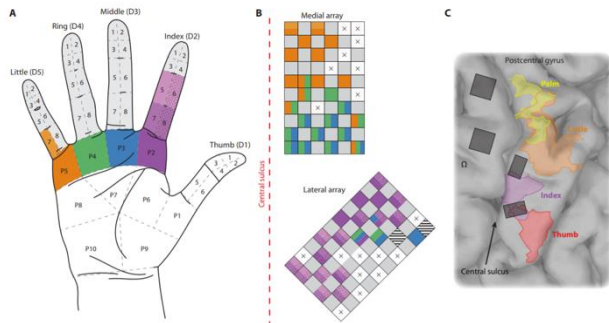


There is a linear relation between perceived intensity of tactile feedback and the amplitude of stimulation

Table 1. Percept qualities evoked by intracortical microstimulation. The number of trials evoking each response type is shown. The totals in each category (naturalness, depth, etc.) differ because the participant did not always provide a complete response for every case where he could detect a stimulus. In 79 cases, a sensation of "tingle" was described without being further described by one of the subcategories.

Naturalness (250)	Depth (247)	Pain (280)	Somatosensory quality (190)
..
..
..
..

How does it feel ?

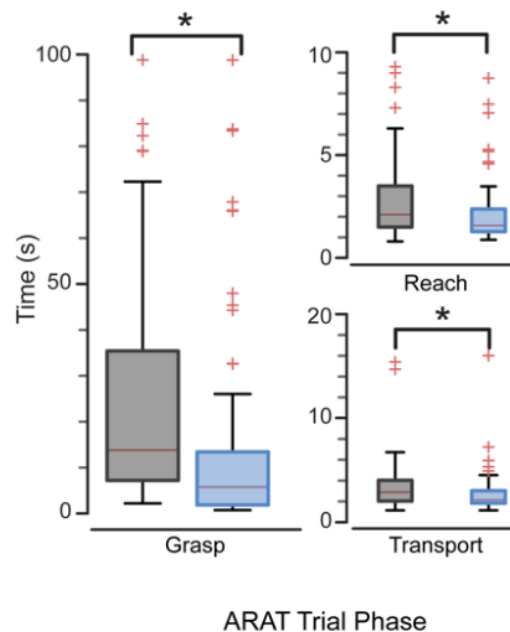
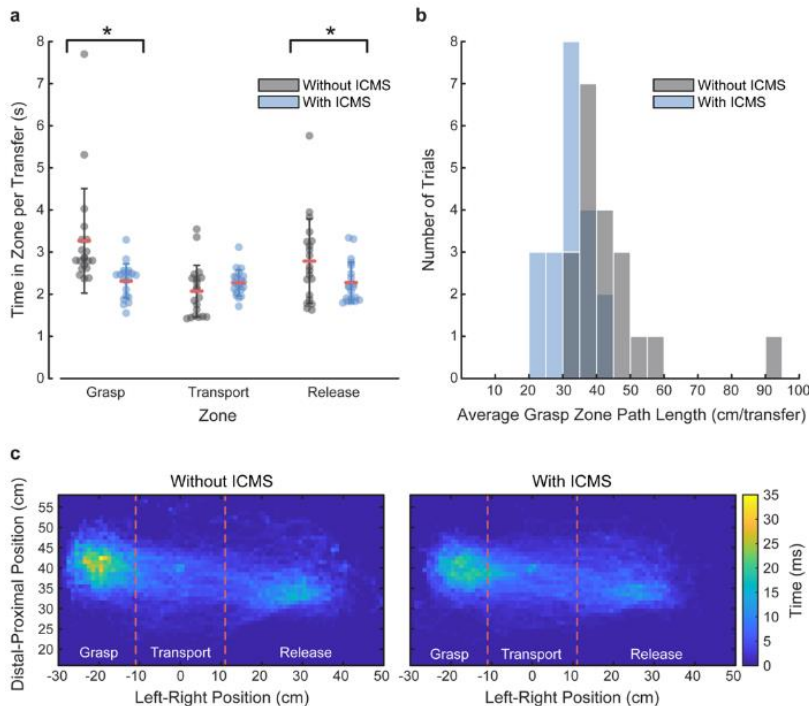


There is a linear relation between perceived intensity of tactile feedback and the amplitude of stimulation

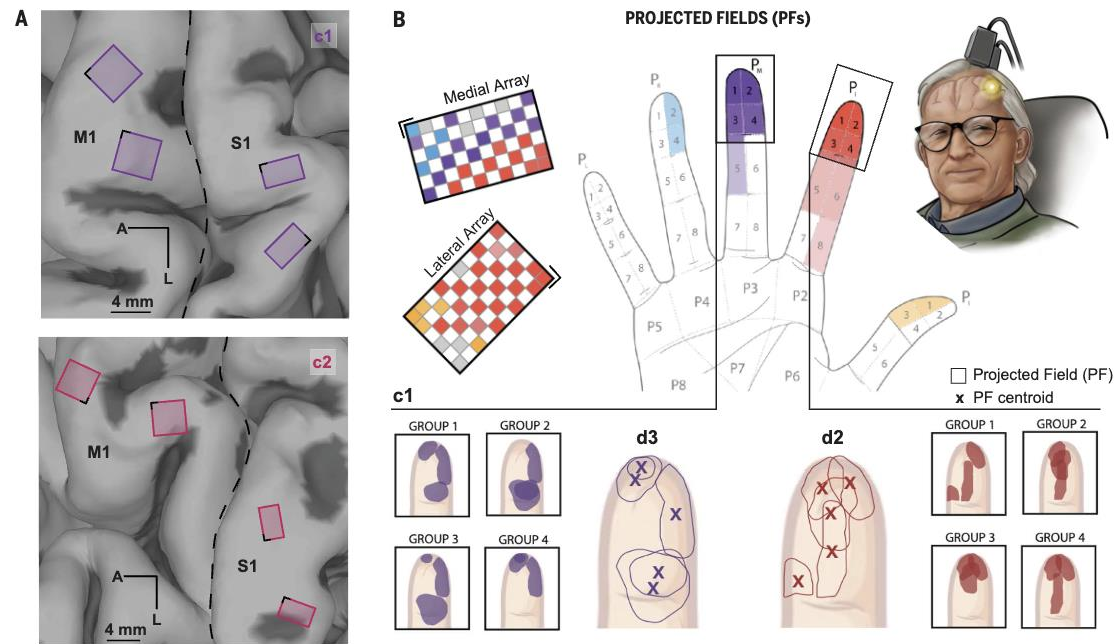
Table 1. Percept qualities evoked by intracortical microstimulation. The number of trials evoking each response type is shown. The totals in each category (naturalness, depth, etc.) differ because the participant did not always provide a complete response for every case where he could detect a stimulus. In 79 cases, a sensation of "tingle" was described without being further described by one of the subcategories.

Naturalness (250)		Depth (247)		Pain (280)		Somatosensory quality (190)	
Totally natural	0	Skin surface	9	0 (no pain)	280	Mechanical	Touch (2), pressure (128), sharp (0)
Almost natural	12	Below skin	5	1, 2, 3	0	Movement	Vibration (1), movement (0)
Possibly natural	233	Both	233	4, 5, 6	0	Temperature	Warm (30), cool (0)
Rather unnatural	5			7, 8, 9	0	Tingle (79)	Electrical (29), tickle (0), itch (0)
Totally unnatural	0			10 (most pain)	0		

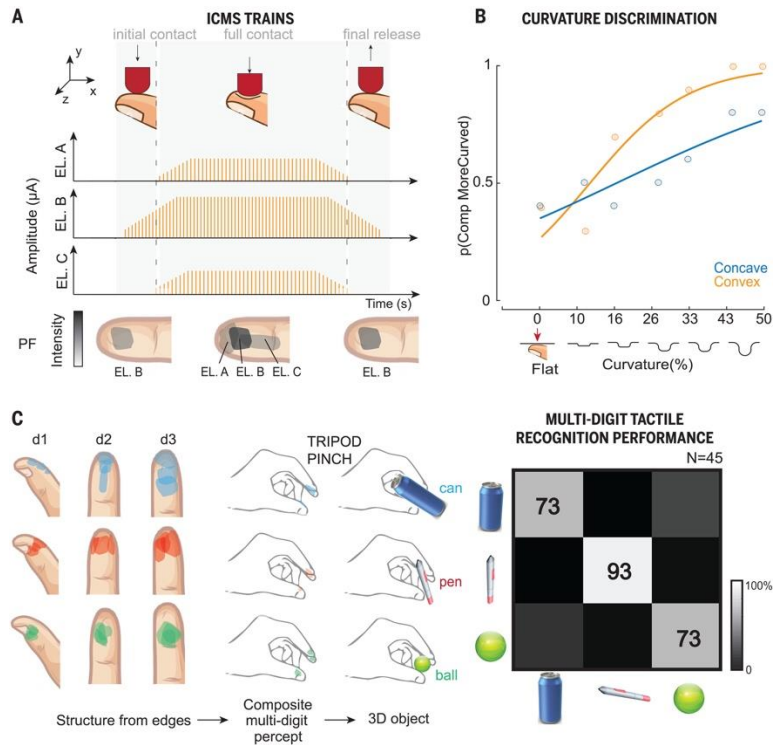
Functional improvement using a bidirectional BMI



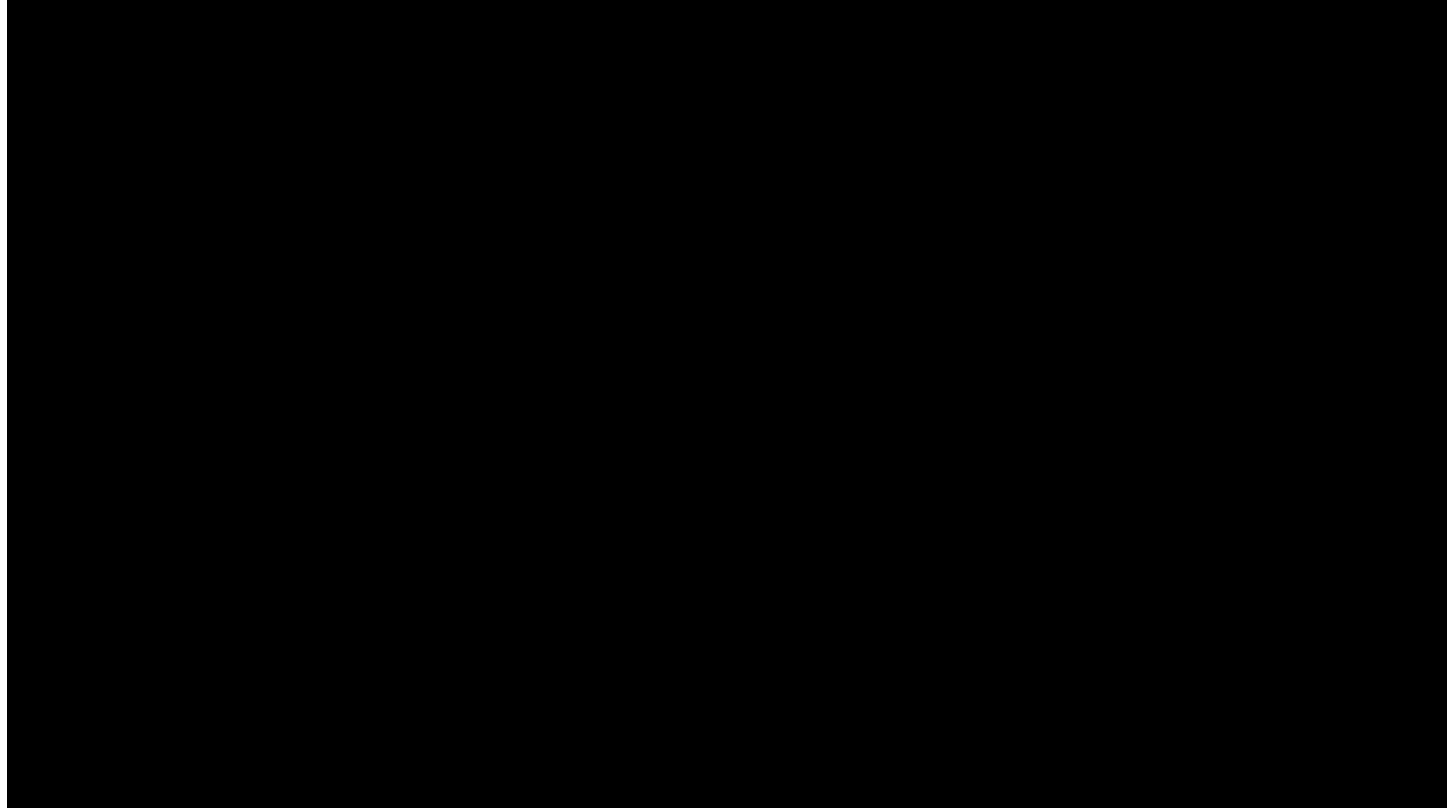
Brain-to-machine-to-brain interface in a quadriplegic subject



Brain-to-machine-to-brain interface in a quadriplegic subject



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- Artificial limbs can be bidirectionally controlled in several ways
 - Non-invasive interfaces for decoding (EMG, EEG) and encoding (vibrators, transcutaneous electrical stimulation)
 - Invasive interfaces for decoding and encoding (ECoG, intracortical, peripheral implants)
- The choice must be done taking into account the residual skills of the subjects AND their preferences
- The different neurotechnological “tools” must be integrated accordingly

