

**Ai**

IA

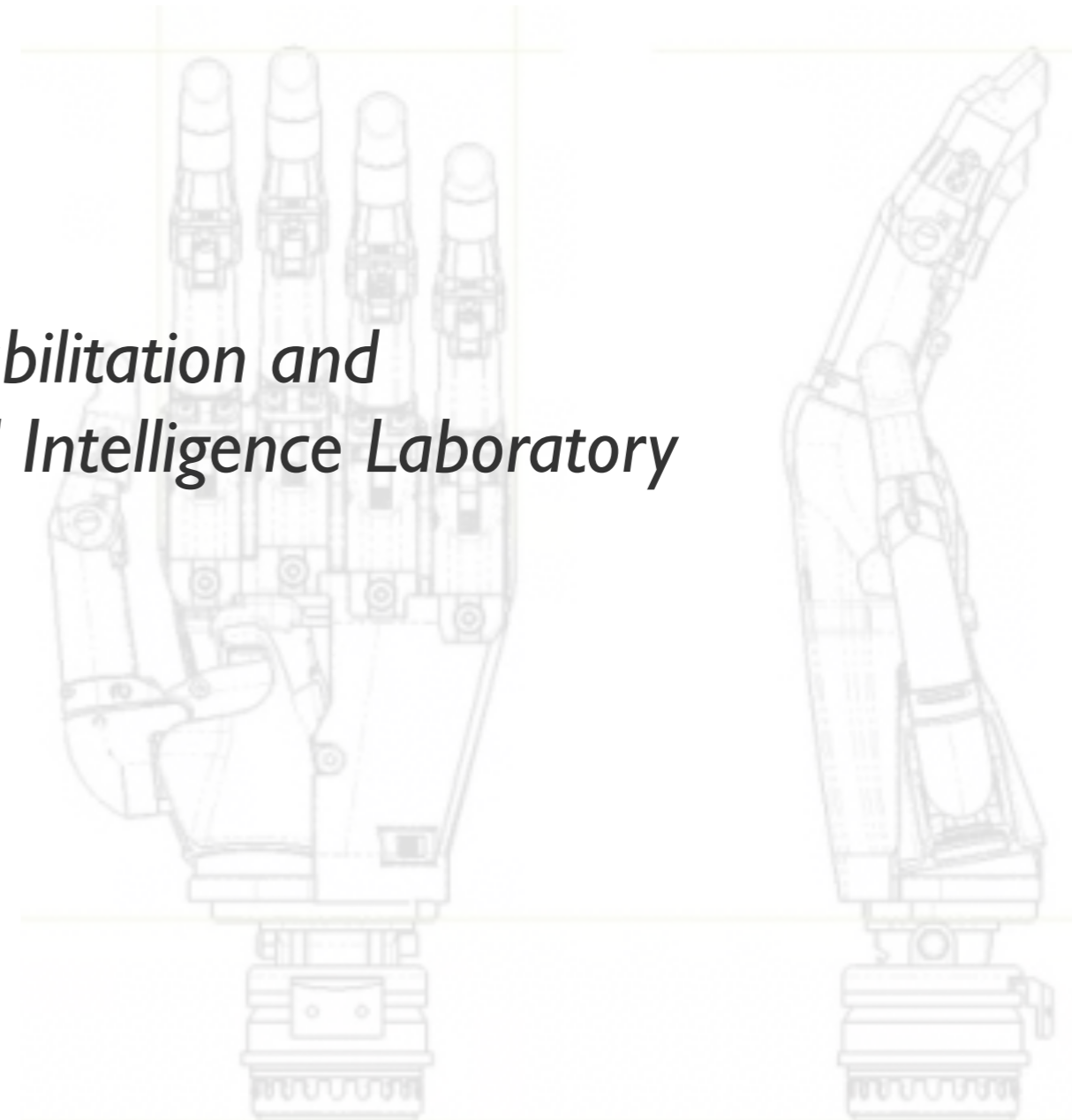
**IA**


**(Intelligence Amplification)**

# Solving Artificial Intelligence (AI) with help from Intelligence Amplification (IA)

Patrick M. Pilarski  
(with Richard Sutton)

*Division of Physical Medicine & Rehabilitation and  
Reinforcement Learning and Artificial Intelligence Laboratory*





I get by **AI** with a little  
help from my ~~friends~~  
**friend's brains**

John Lennon





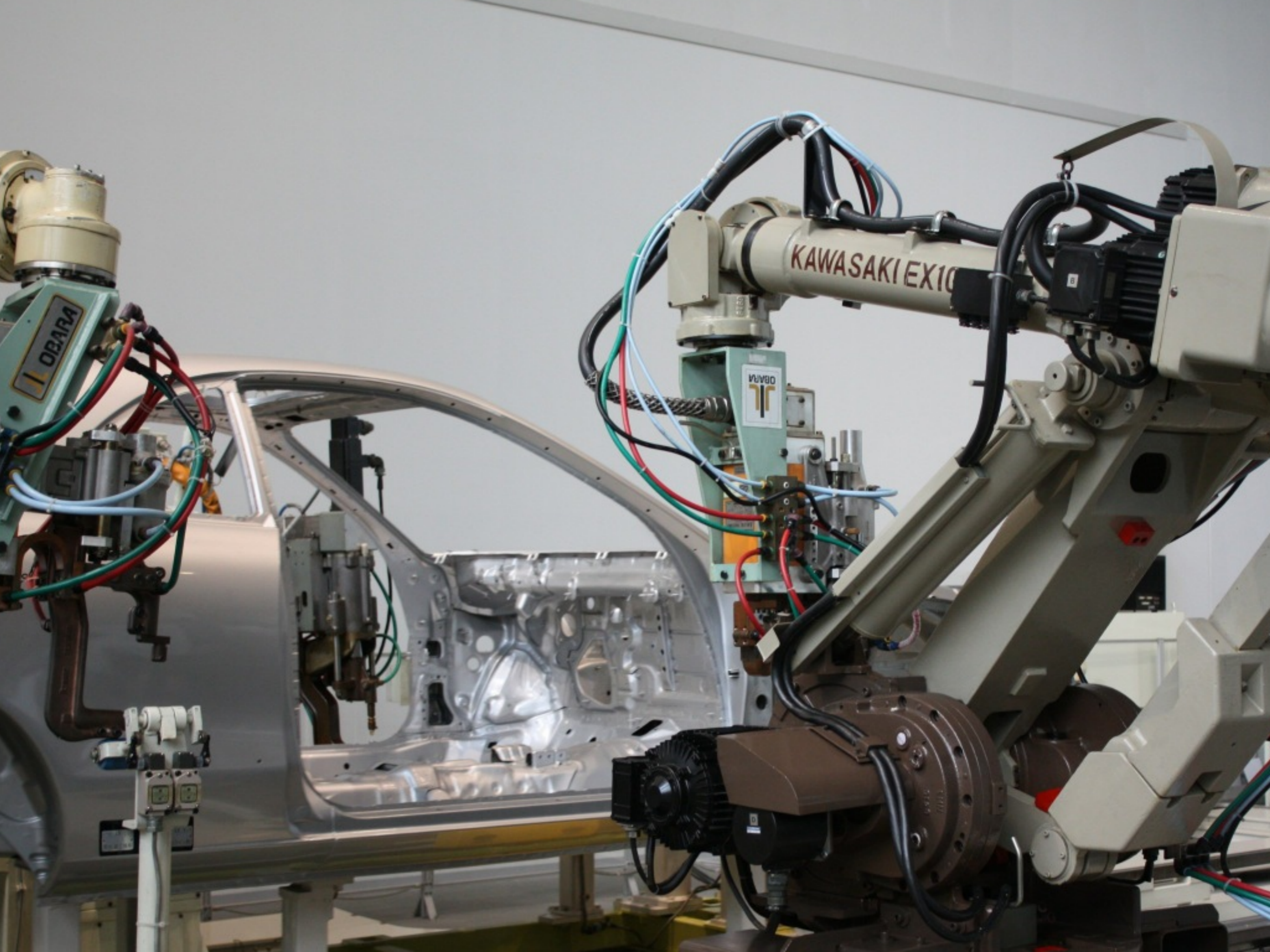
STICK  
{a stick,  
branch,  
twig}

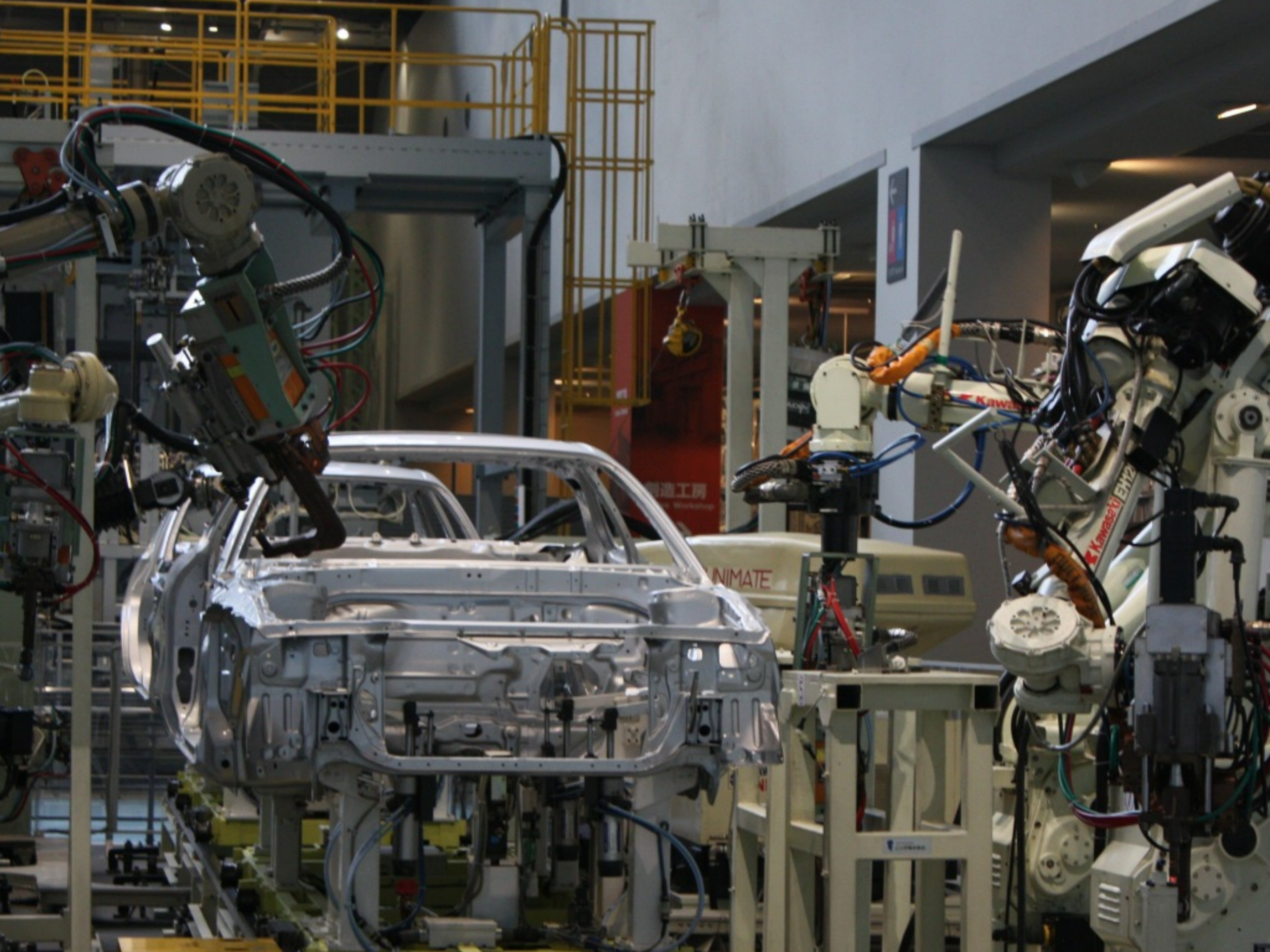
{force multiplier,  
remote actuation}

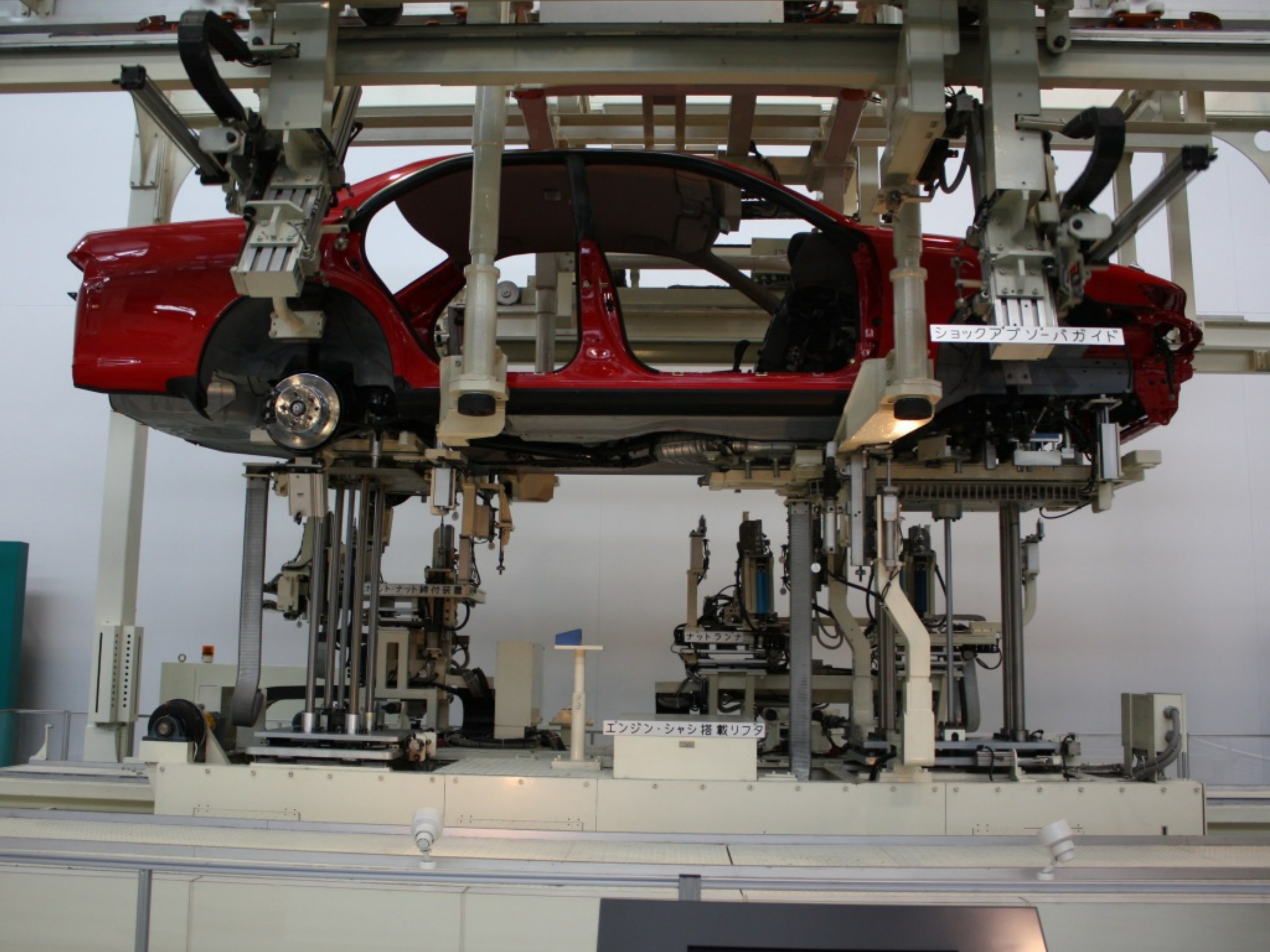


STICK  
{a stick,  
branch,  
twig}









ショックアブソーバガイド

エンジン・シャシ搭載リフト

ナットランナ

ボルトナット挿付装置



# SPINNING WHEEL



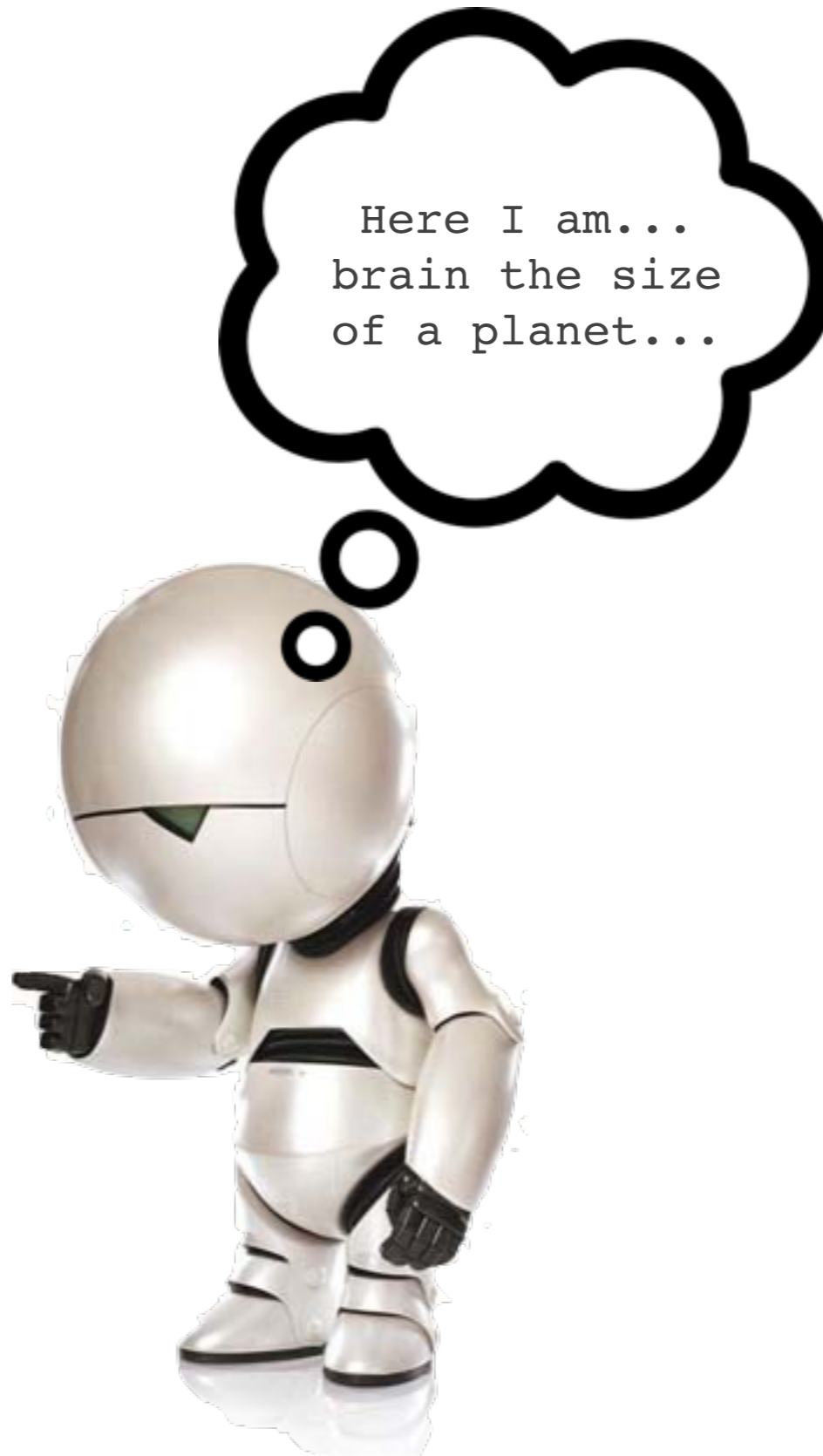
{animal fur,  
plant matter}

>>

{thread,  
yarn}



**... and, in short order ...**



**Marvin the paranoid android from THHGTTG.**



# Intelligence: One Possible Definition

- A system that can:

**Perceive and Represent its world.**

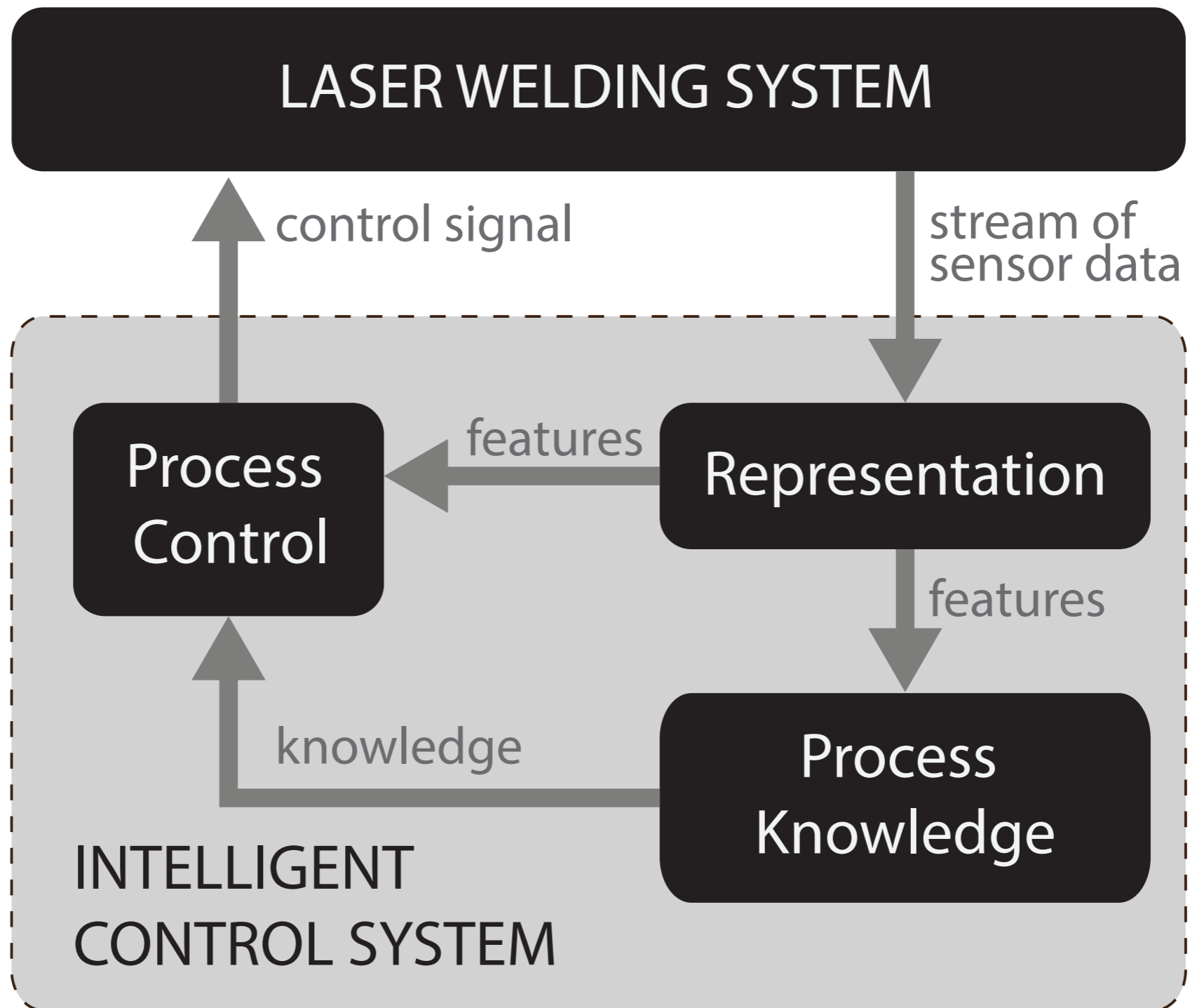
**Predict its world.**

**Control its world.**

- “The **Pursuance of future ends** and the **choice of means** for their attainment, are thus the mark and criterion of the presence of mentality in a phenomenon” (James, 1890)
- **Purposeful**: to have, seek & achieve goals (Sutton, 2001).

# Key Aspects of Intelligence

Intelligence revolves around maintaining and using knowledge (representation, prediction, control) in a purposeful way.



Example: *Gunther et al. 2014, 2015, in revision.*

# Door I

- Perhaps the most popular approach?
- Create or enable a goal-seeking agent that integrates representation, prediction, and control.
- Undertake learning and planning so as to achieve the agent's goals.

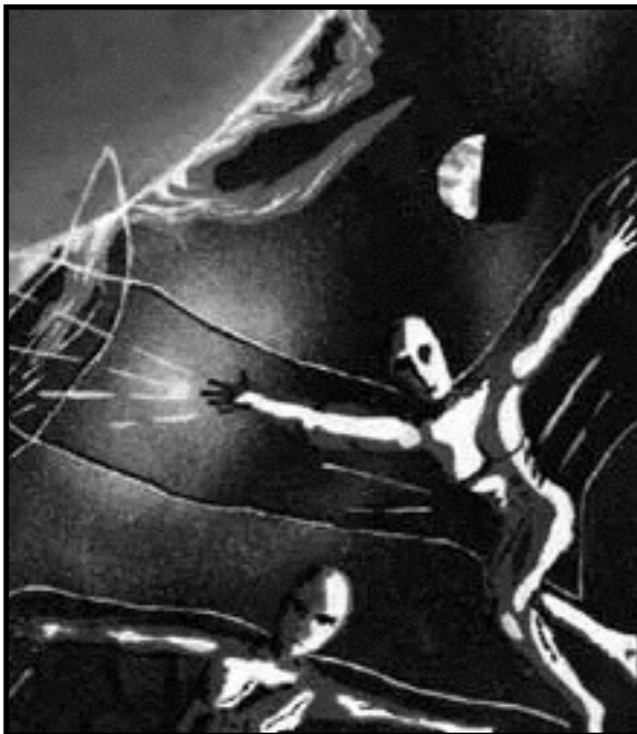
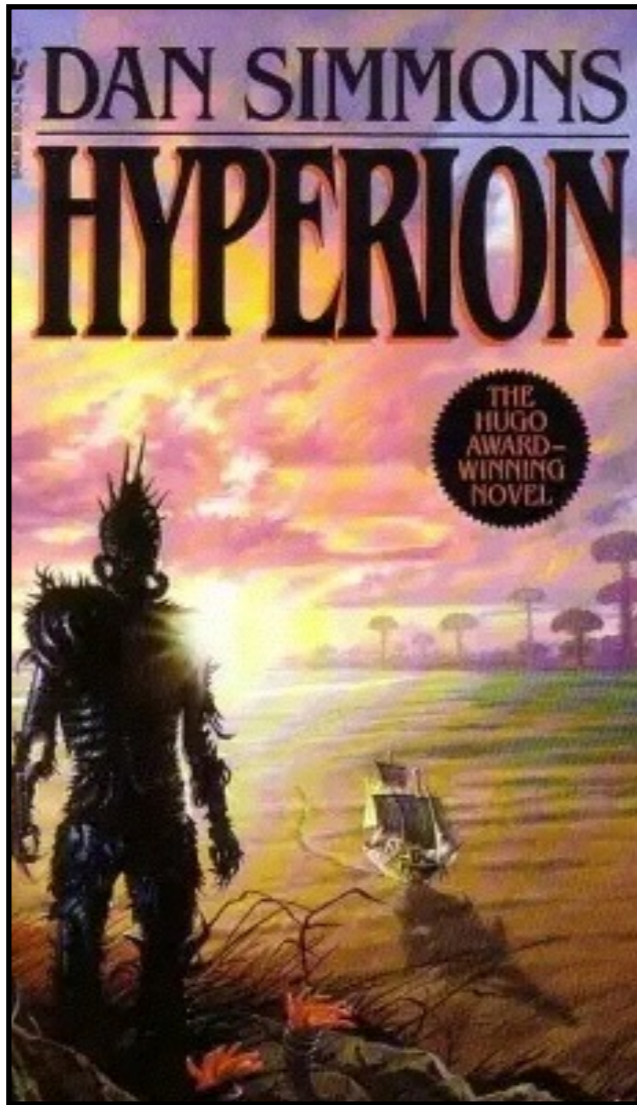
**This door is reasonable and fruitful.**

# Door II

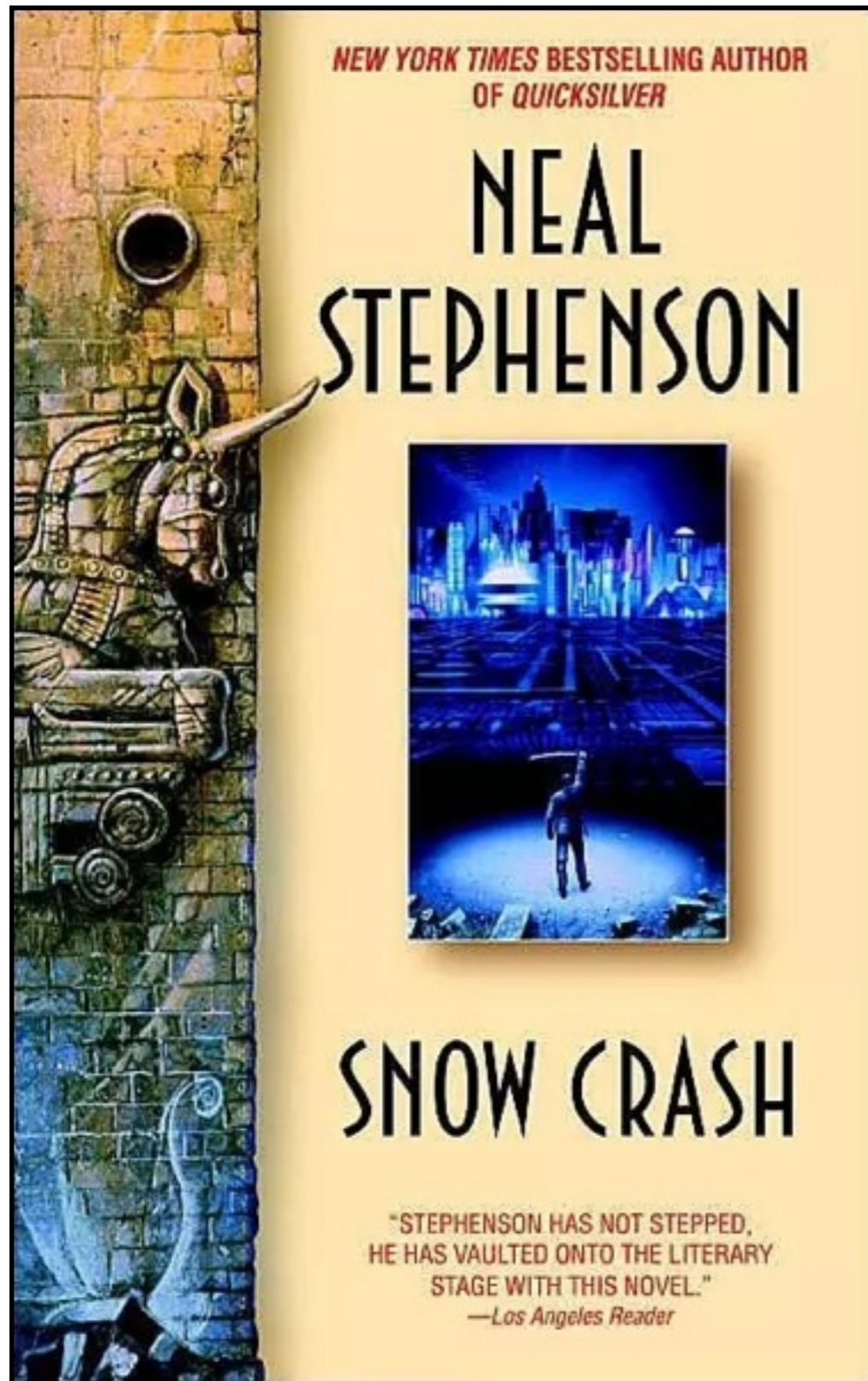
- **Enhance** an existing goal-seeking agent using representation, prediction, and control.
- Undertake learning and planning so as to achieve the agent's goals.
- Key point: **communication**. The emerging, adapting connections between two complex intelligent systems.

# How to Approach Door 2?

- Multi-agent RL?
- Boosting?
- Systems of experts?
- Extreme connectivism?
- **Enhancement:** extending (augmenting or restoring) innate or acquired human abilities.

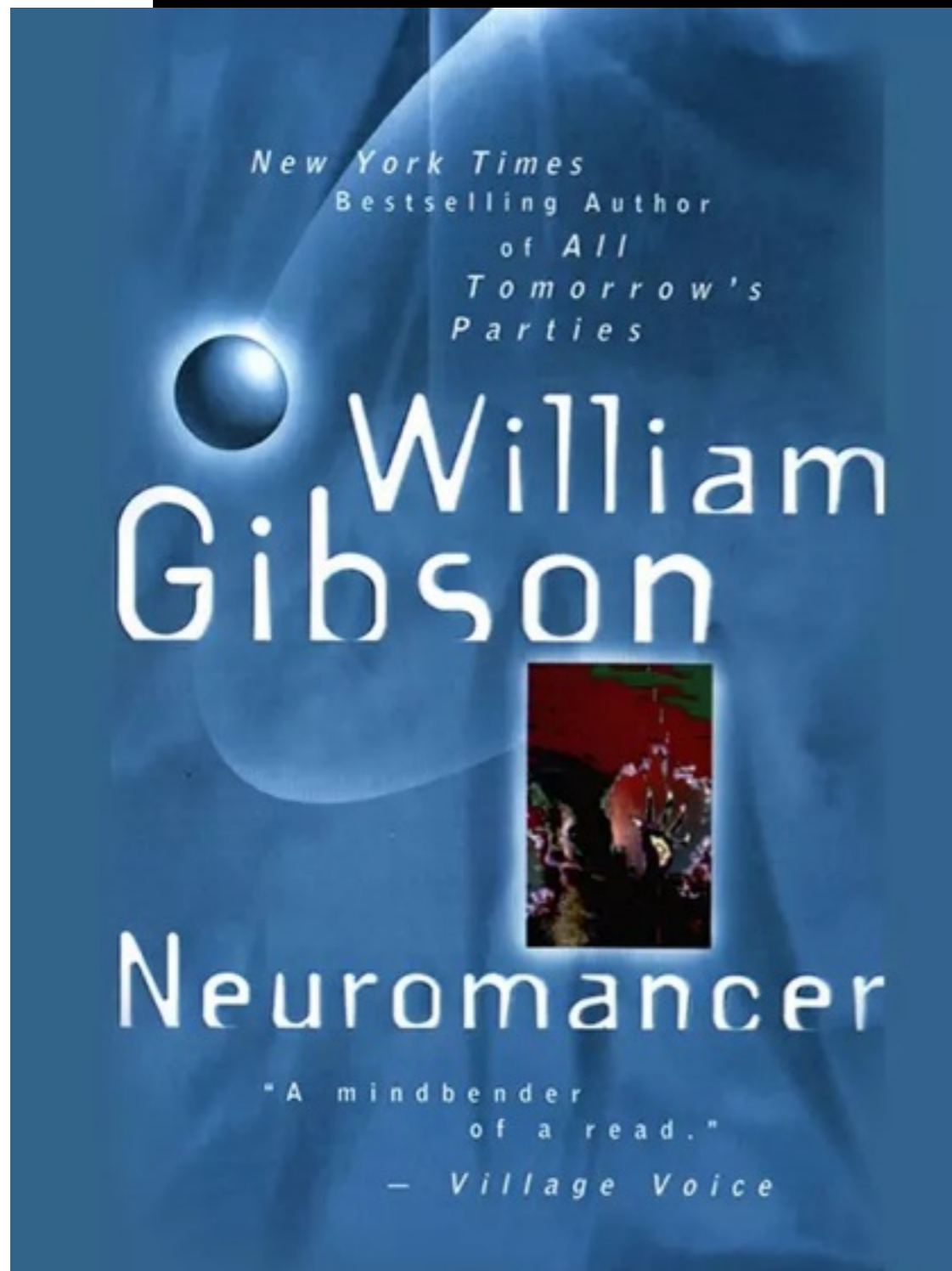


Ousters from Dan Simmons' *Hyperion* series.



The **Gargoyles** from Neal Stephenson's cyberpunk dystopia novel *Snow Crash*.





**Molly Millions** from Williams Gibson's sprawl trilogy and short stories.



**Samus Aran** from the Metroid video game franchise.

# Kinds of Enhancement

Extend

Restore/Recover

Motor

Sensory

Cognitive



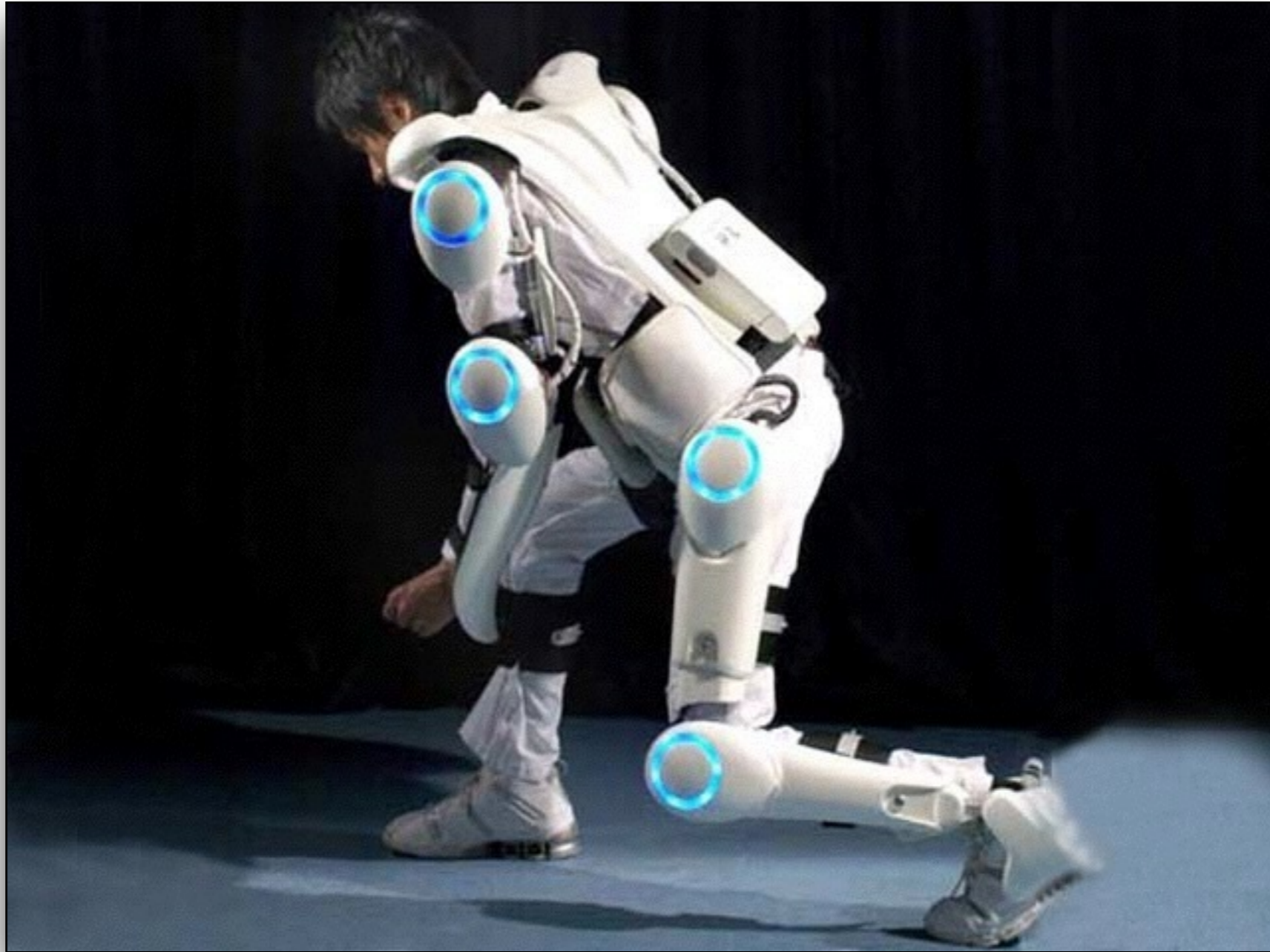
These areas are continuous with ordinary, normal things that humans do every day.

# Why we should care.

- All six cases occur & are important
- All six cases range from fancy to ordinary
- Lots of mid-range economically and socially important instances of them.



**Samus Aran** from the Metroid video game franchise.



**Hybrid Assistive Limb (HAL):** Cyberdyne Inc., Japan.



**Hybrid Assistive Limb (HAL):** Cyberdyne Inc., Japan.



**Geminoid Robot** designs of Hiroshi Ishiguro

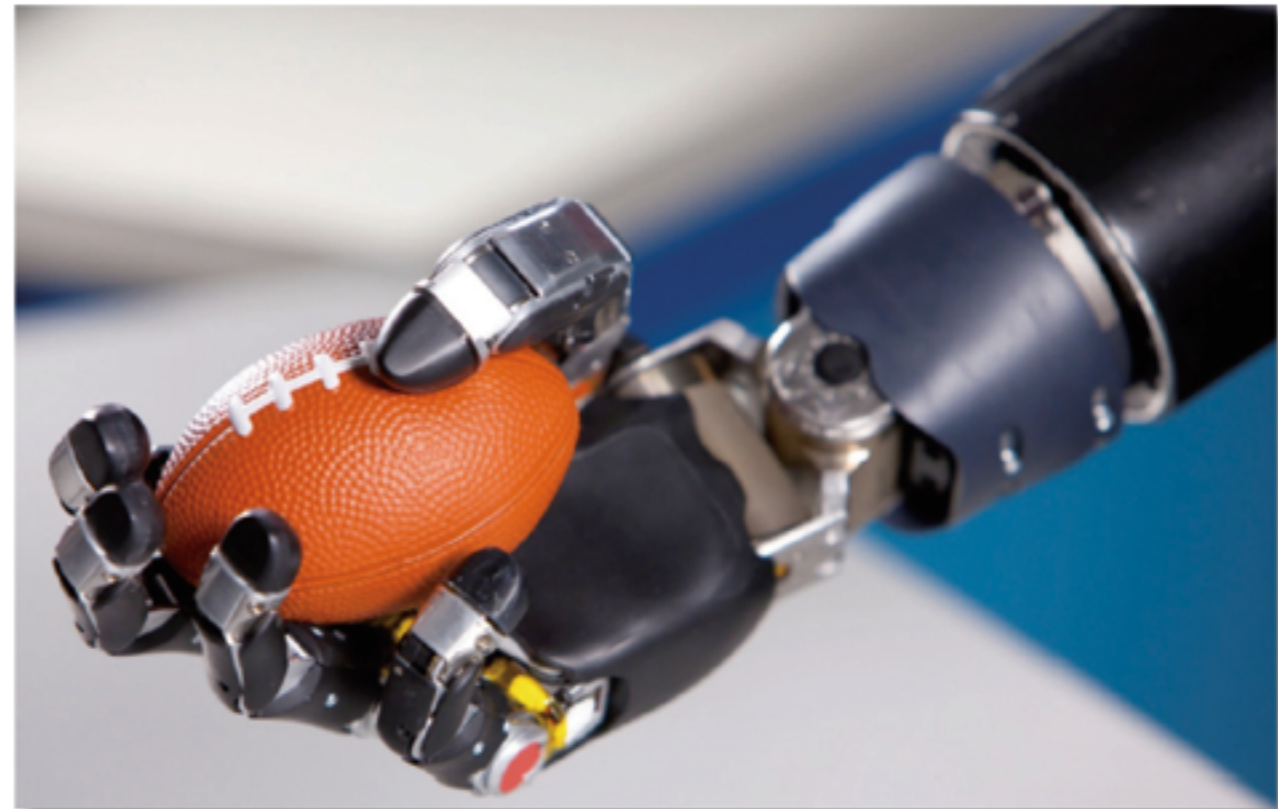




Rehabilitation Institute of Chicago (RIC) research subject, **Zac Vawter** at the top of the Willis Tower in Chicago (Photo: The Associated Press).



***MPL v1.0 (Johannes et al., 2011)***



***MPL v2.0 Serial I (Johannes et al., 2011)***



***DEKA Arm, 2014***



Courtesy of DEKA Research & Development and  
The Rehabilitation Institute of Chicago



Courtesy of DEKA Research & Development and  
The Rehabilitation Institute of Chicago



**Direct brain-computer interfaces:** study participant Jan Scheuermann feeding herself with a robotic limb (University of Pittsburgh)  
<http://www.upmc.com/media/media-kit/bci/Pages/default.aspx>



**Direct brain-computer interfaces:** study participant Jan Scheuermann feeding herself with a robotic limb (University of Pittsburgh)  
<http://www.upmc.com/media/media-kit/bci/Pages/default.aspx>

# Regarding Enhancement

- **Opportunity for research:** much (all?) work in direct human machine interfaces has focused on the physical connection (e.g. electrodes, wires, materials).
- Need for more thought regarding interfaces w.r.t. computation and info proc.
- We suggest there is a need for an overarching perspective.

# An Overarching View

1. An enhancing (assistive or augmentative) device should be a goal-seeking **agent**.
2. An agent-based viewpoint enables a fruitful **progression** in terms of human-device interaction.
3. **Prediction**, integrated with representation and control, forms a strong basis for progressive assistance and augmentation.





**Machines learn and adapt to human users . . .**

... humans change to better interact with machines.



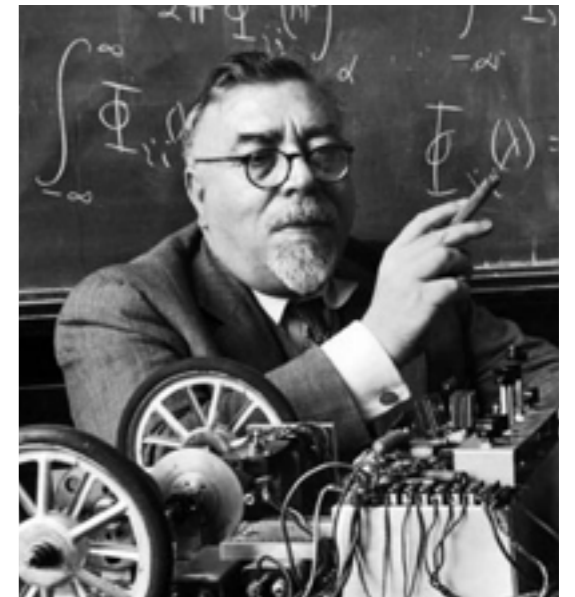
Towards a Perfect Assistant



Stairwell from  
Antoni Gaudi's La Sagrada Familia

# Putting things together at scale ...

- Not algorithm to algorithm or module to module.
- Intelligence to intelligence.
- ***Communication, intentions, and building up communicative capital.***  
Can it start from simple primitive signals? +/- reward?

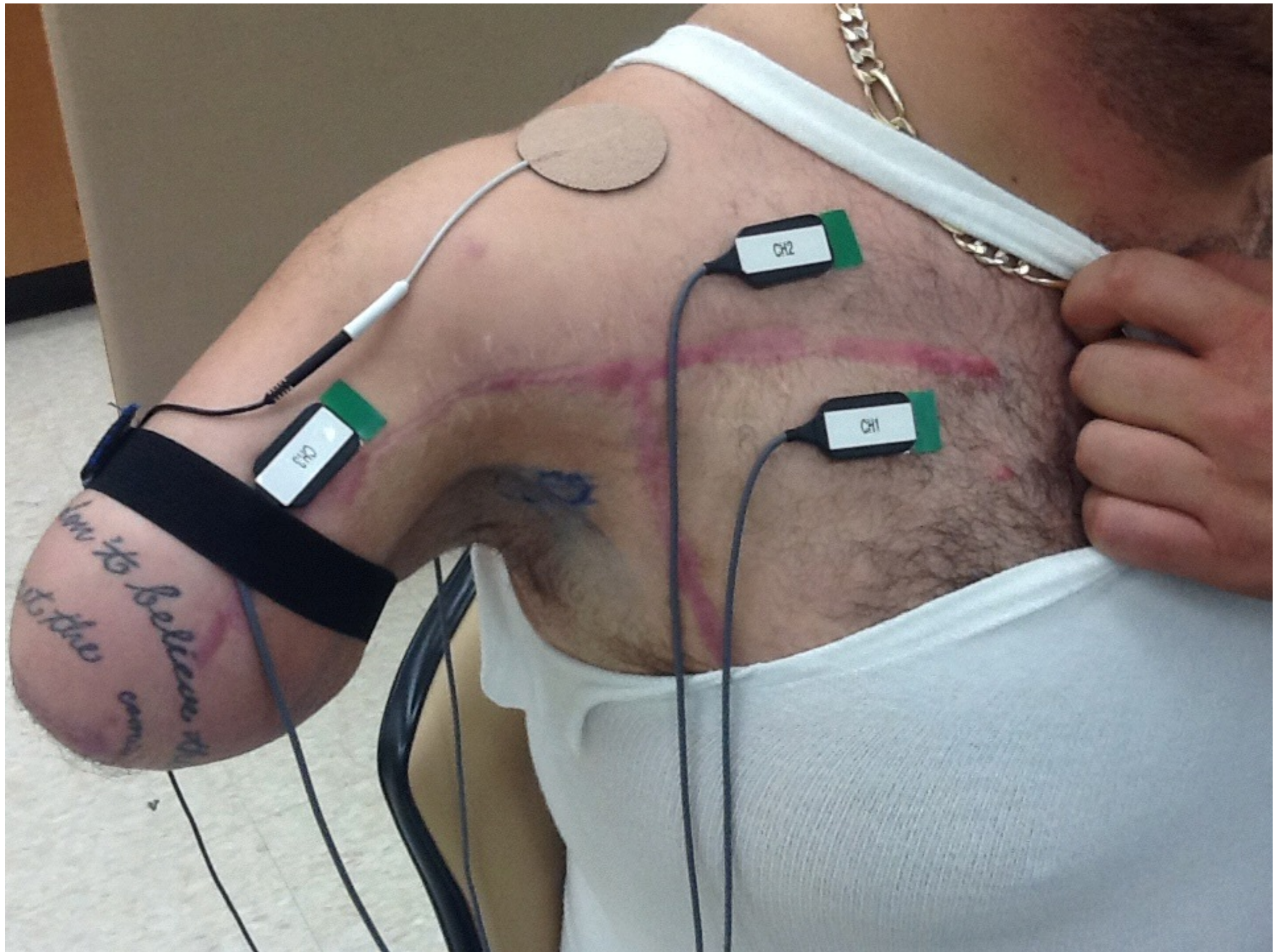


Maybe re-read Norbert Wiener, 1948: *Cybernetics: Or Control and Communication in the Animal and the Machine.*

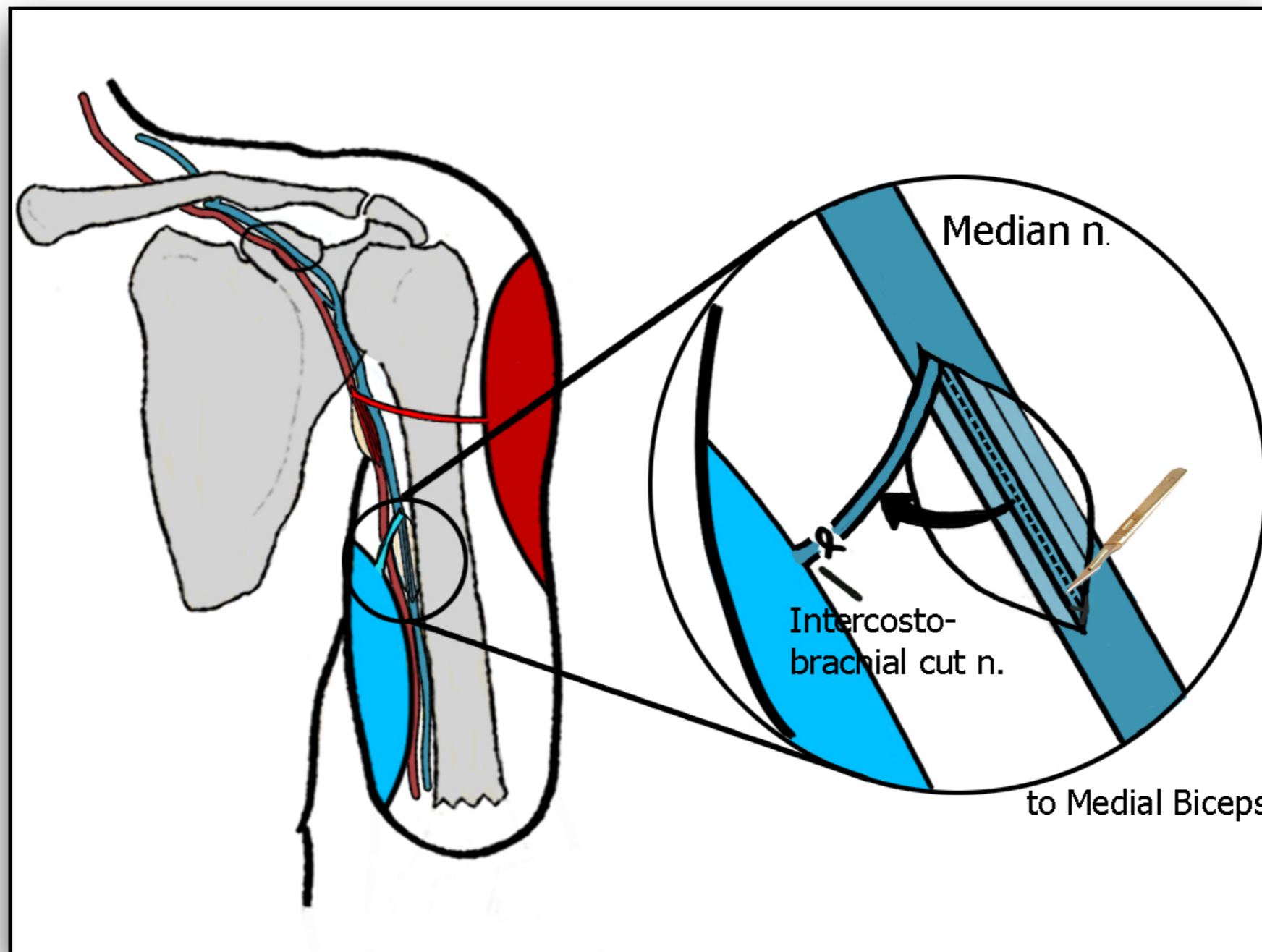
# What are we doing to help out?

A special / constrained / unusual / fruitful setting:  
*robots directly attached to the human body.*





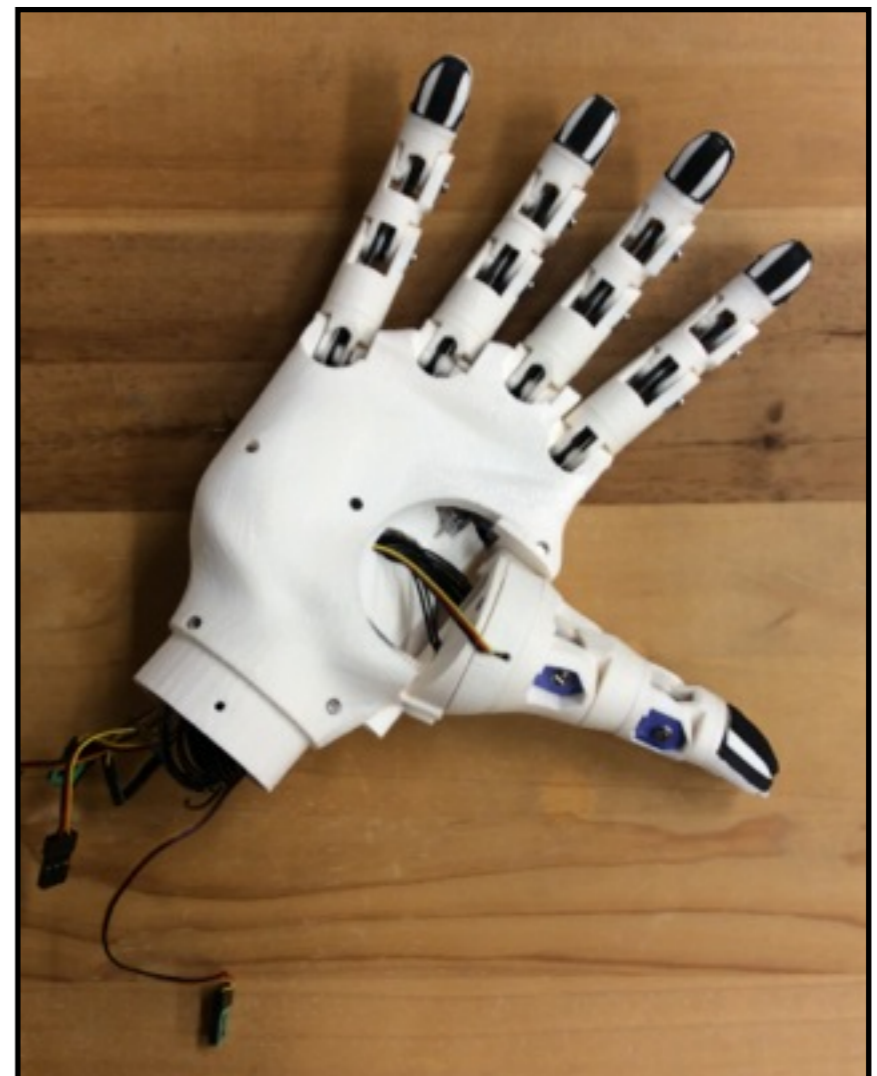
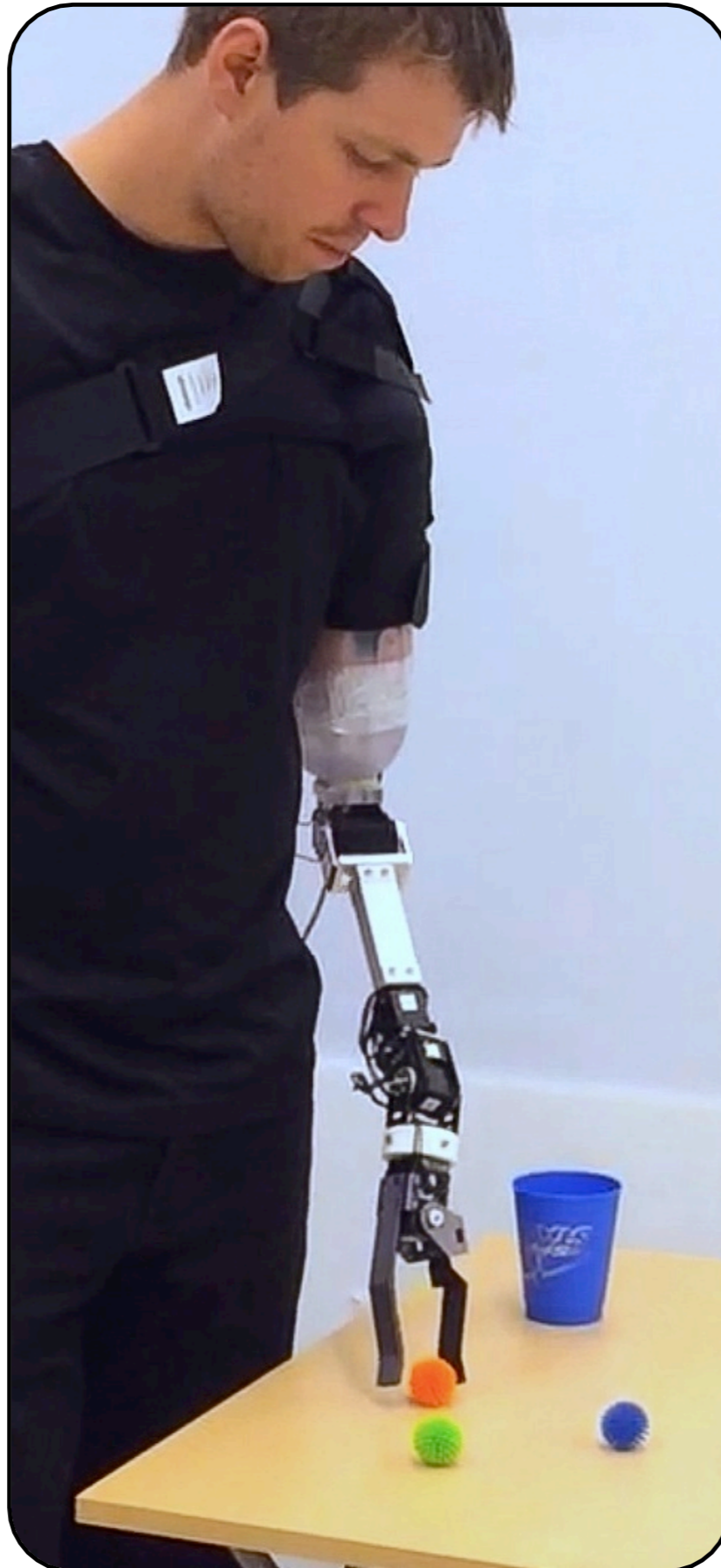
# Re-wiring the Nerves



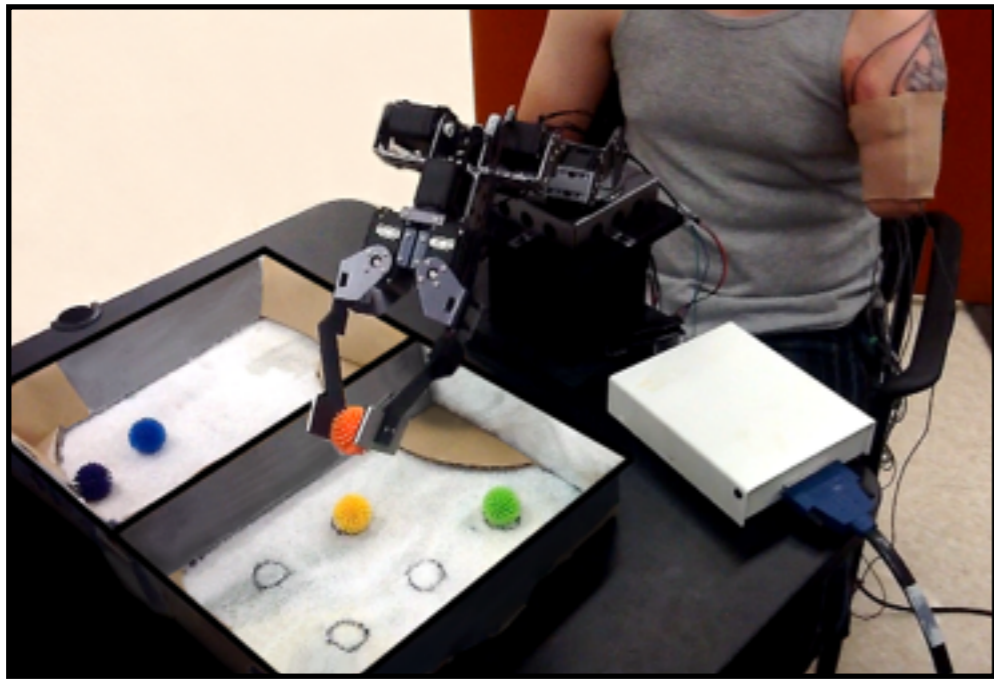
TSR: Targeted Sensory Reinnervation

# Custom Robotic Systems

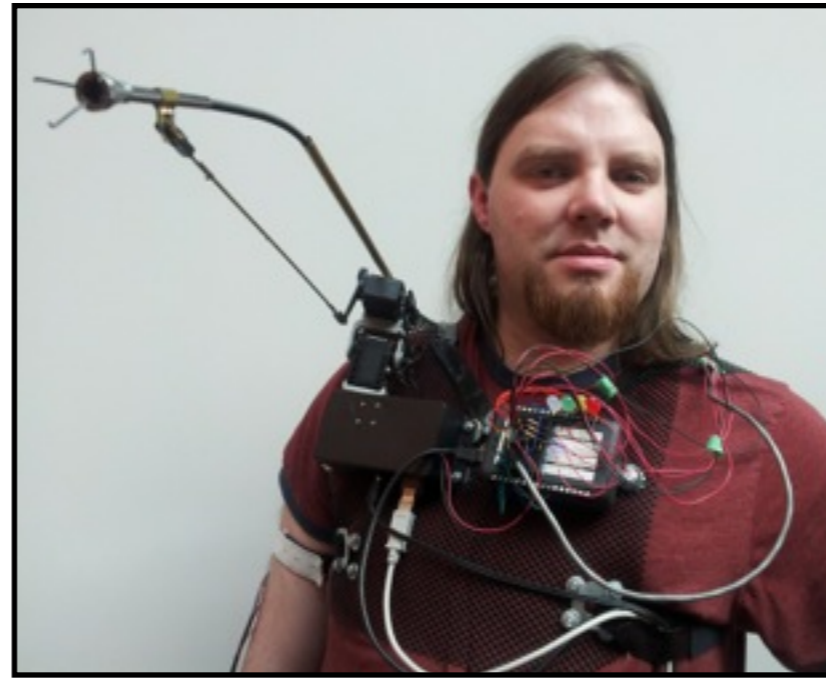
Technology  
designed  
with  
machine  
learning  
in mind.







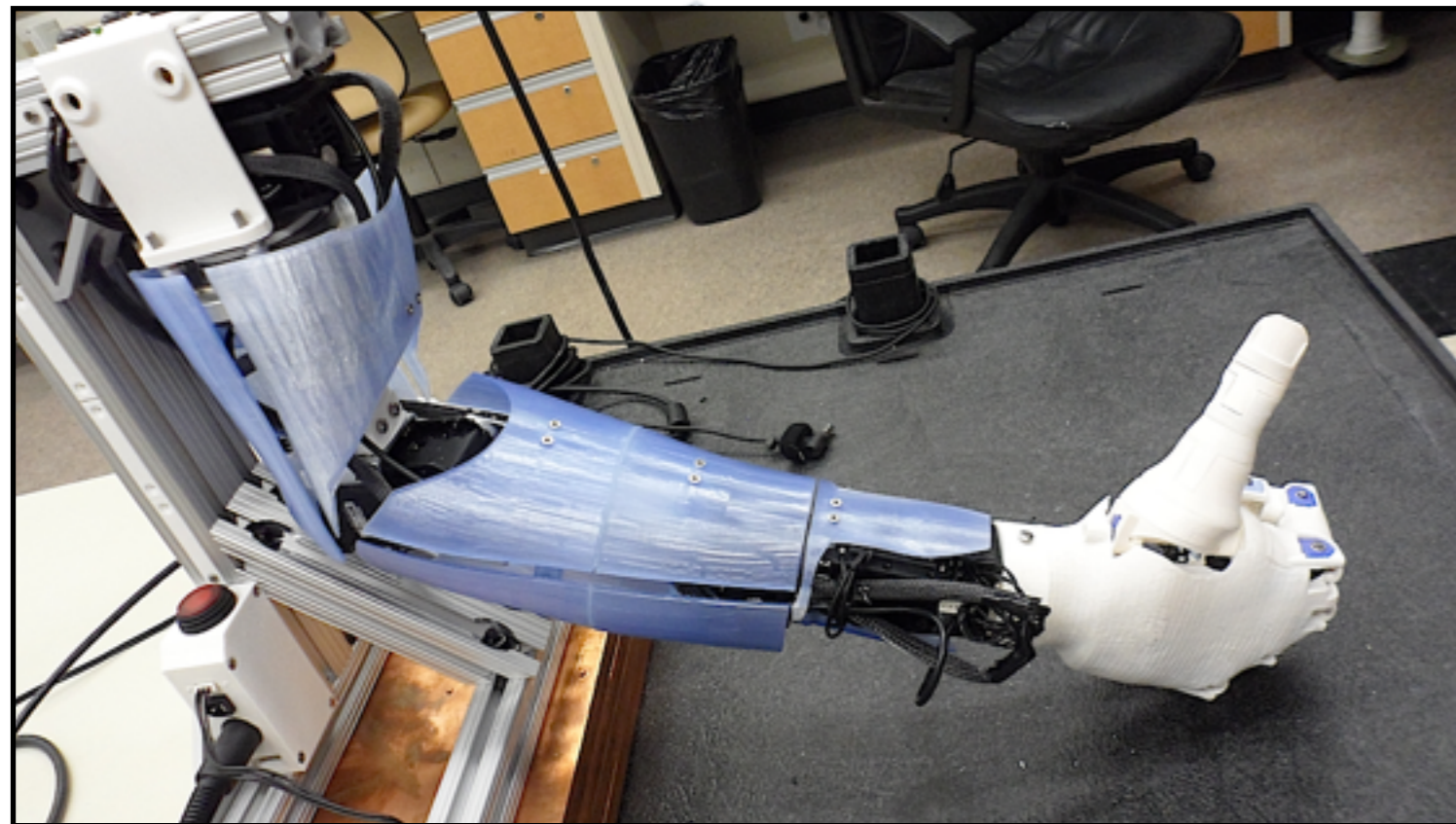
**The Myoelectric Training Tool**  
5 DoF + >20 Sensors



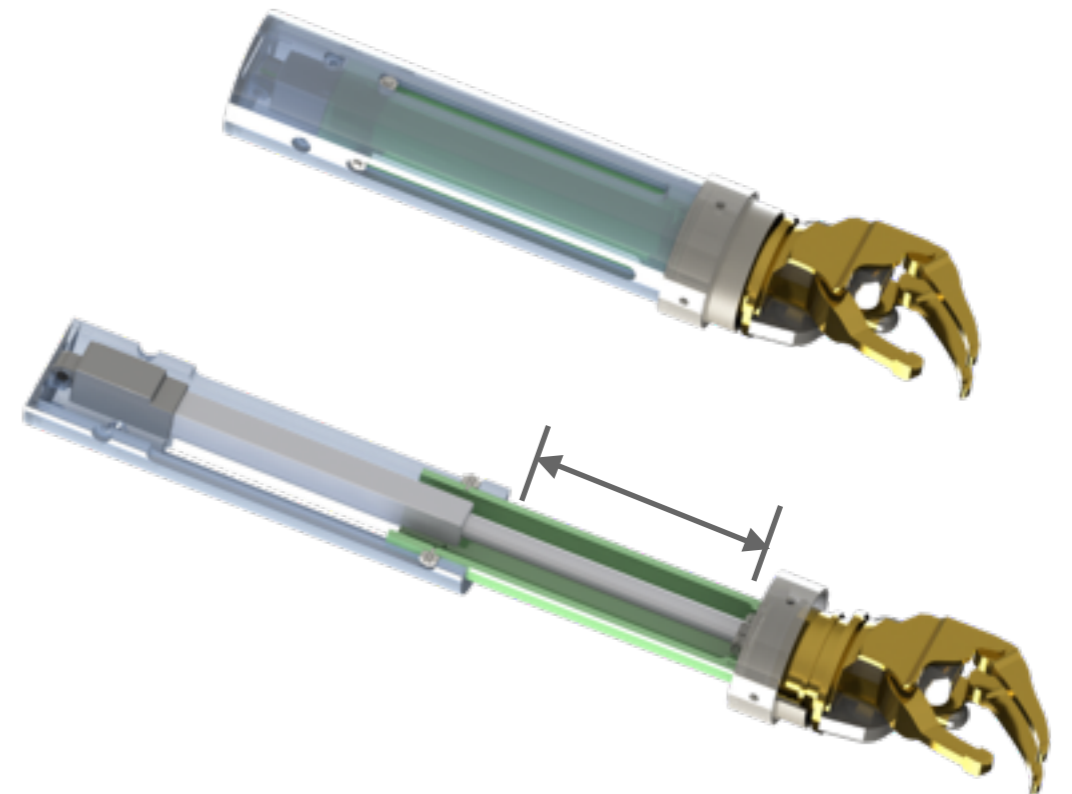
**The exArm**  
4 DoF + 4 FbDoF + >16 sensors



**HANDi Hand**  
6 DoF + 25 Sensors + Camera



**The Bento Arm and HANDi Hand**  
11 DoF + 41 Sensors + Camera



**Extendable Forearm Prosthesis**  
Hand + 1 DoF (Non-Physiological)







# Planning and Meta-learning

Control  2009

Prediction

Representation



# Planning and Meta-learning

Control



Prediction

2010



Representation



# Planning and Meta-learning

Control



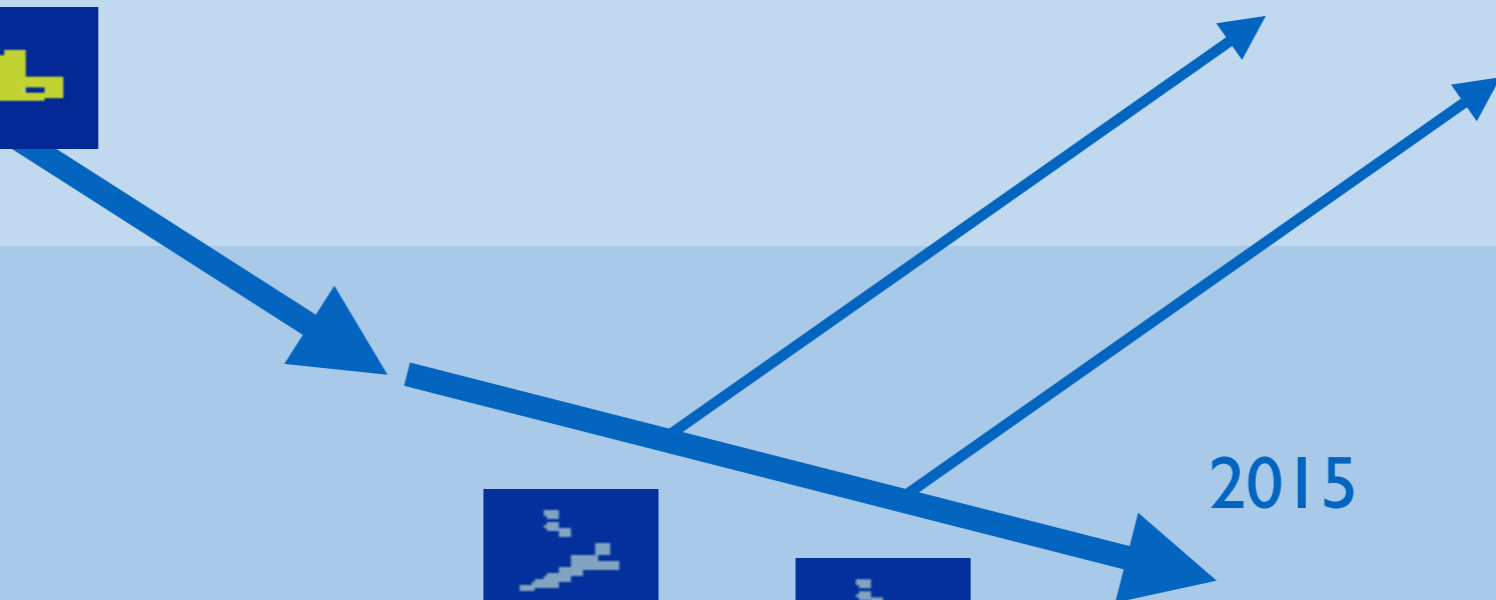
Prediction



Representation



2015

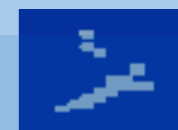


# Planning and Meta-learning

Control



Prediction

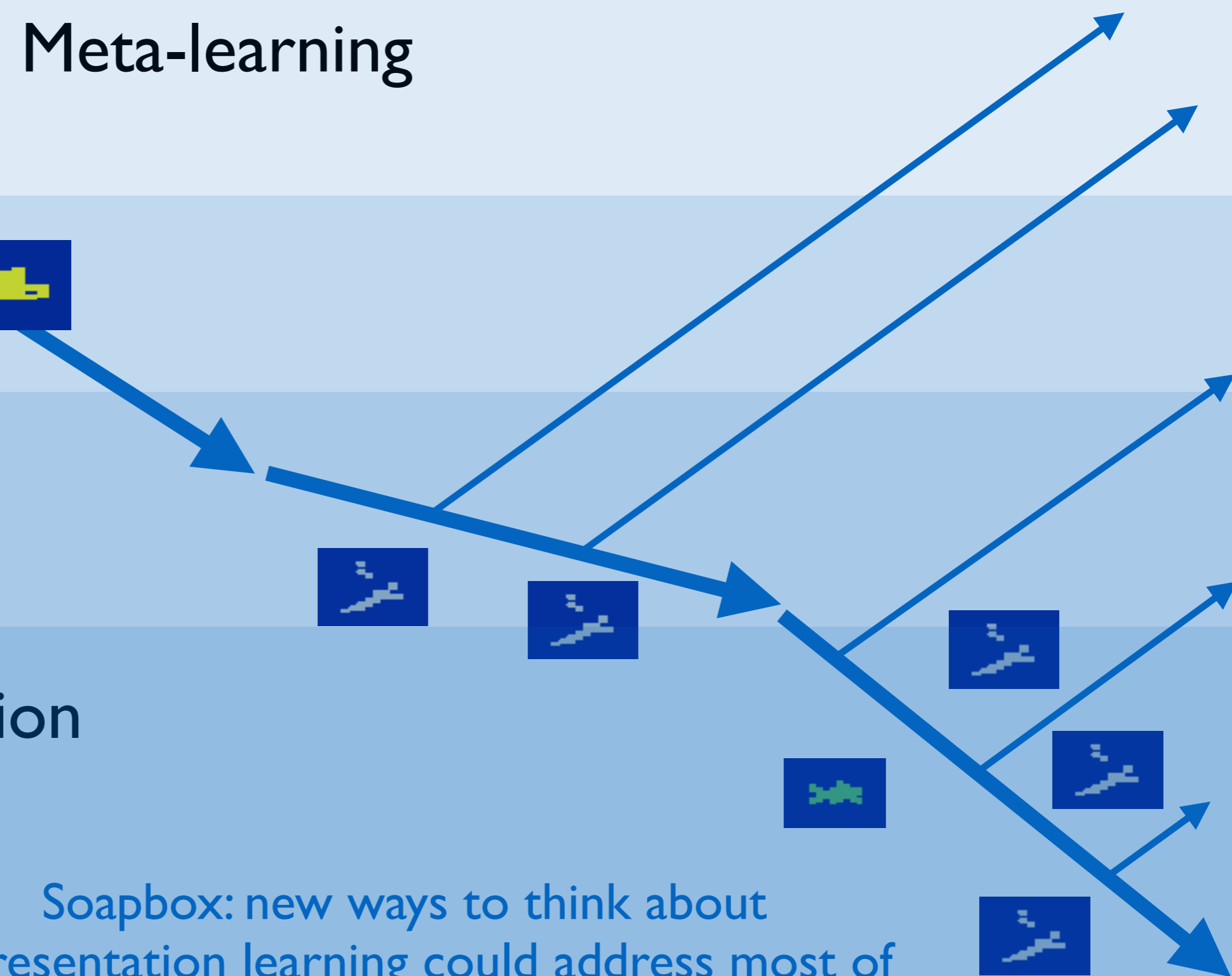


Representation



Soapbox: new ways to think about representation learning could address most of the open problems discussed this week.

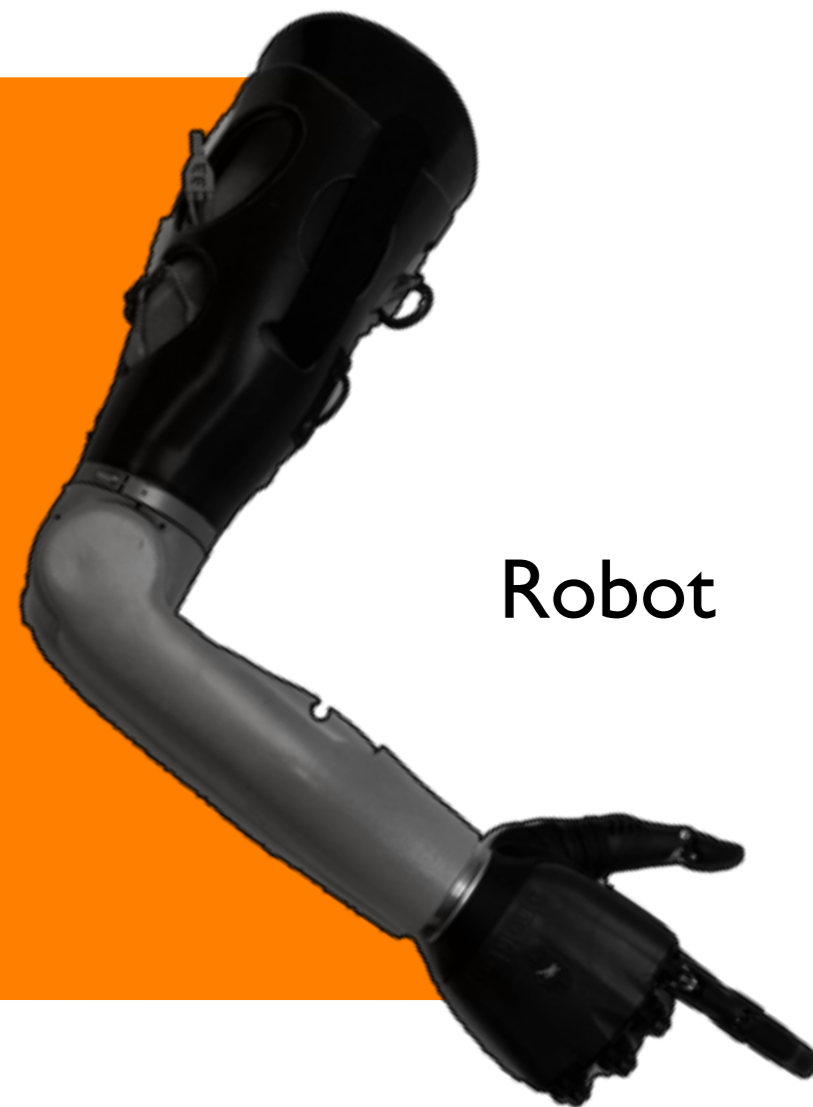
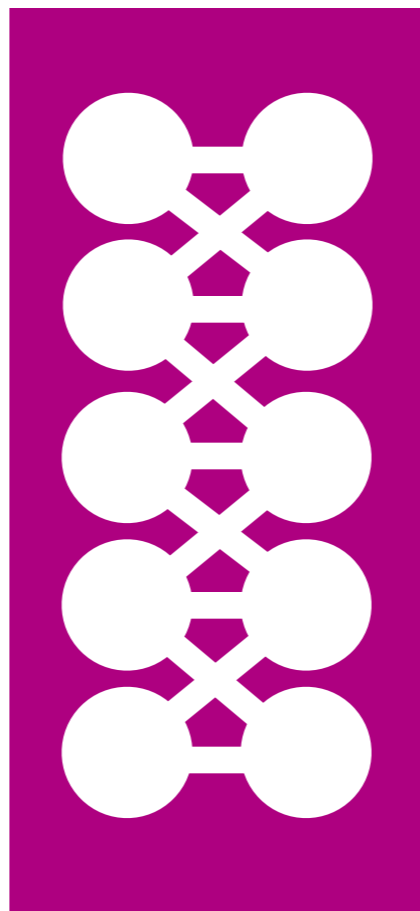
2020



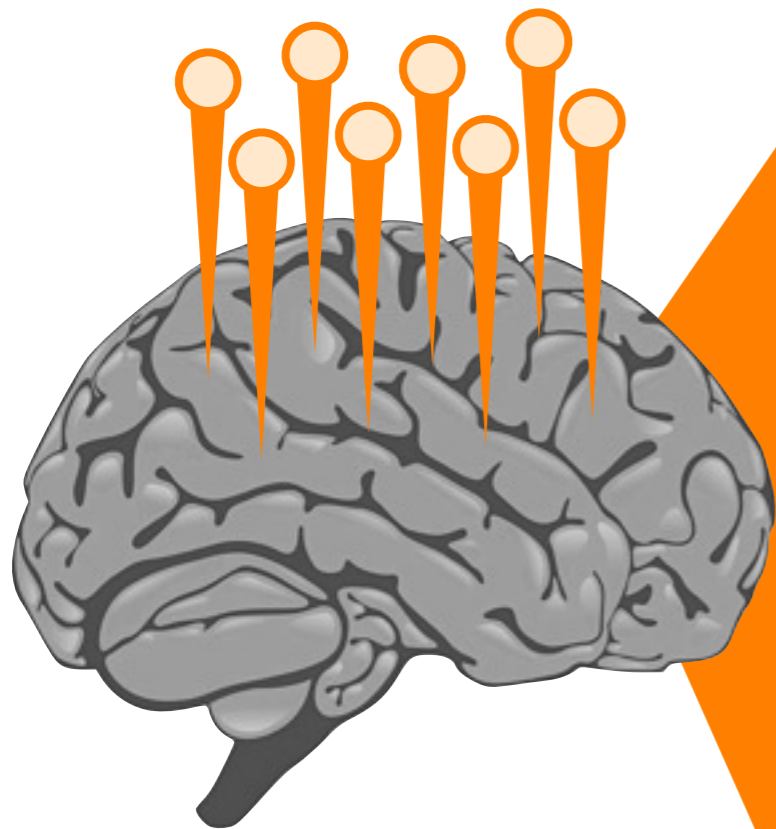




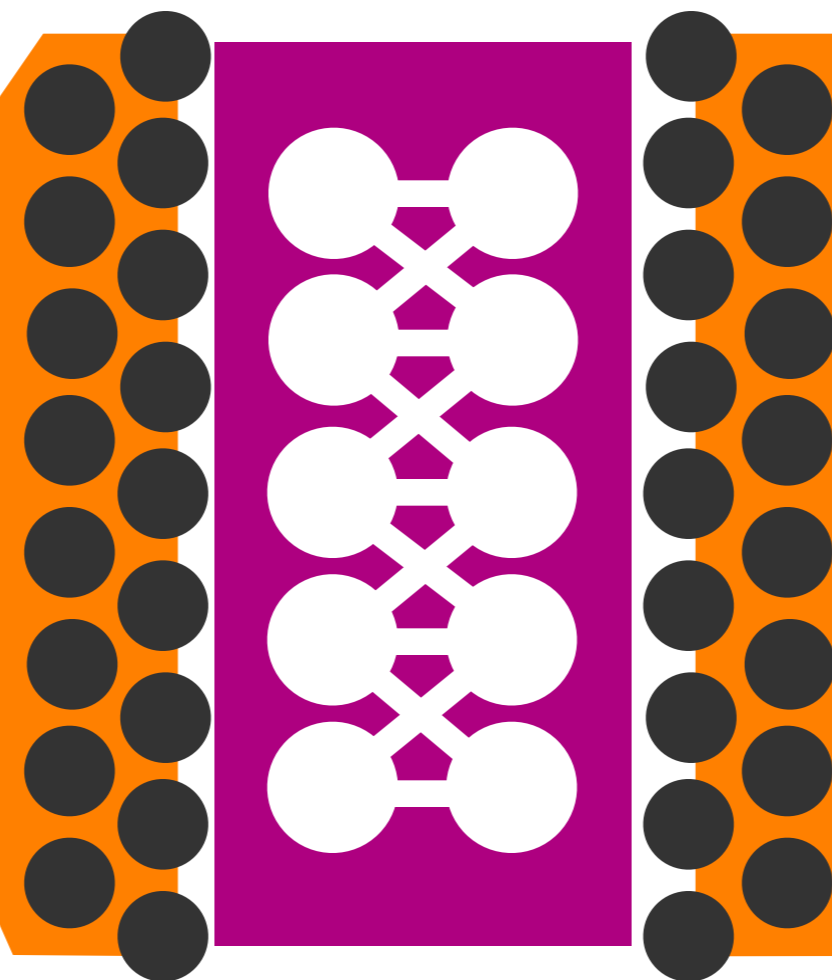
Human Body



Robot



Human Mind



Synthetic Body

Google

Web

Images

Videos

News

More ▾

English – detected ▾



Japanese ▾



maple syrup is not a  
robot

メープルシロップは、ロ  
ボットではありません

Mēpurushiropu wa, robotode wa  
arimasen

### Google Translate

[translate.google.ca/](https://translate.google.ca/)

Google's free online language **translation** service instantly **translates** text and web pages. This translator supports: English, Afrikaans, Albanian, Arabic, ...

### Free Translation and Professional Translation Services from SDL

[www.freetranslation.com/](https://www.freetranslation.com/)

SDL is the world's number 1 provider of free and professional language **translation** services for websites and documents. **Translate** from English to Spanish, ...

### Bing Translator

[www.bing.com/translator/](https://www.bing.com/translator/)

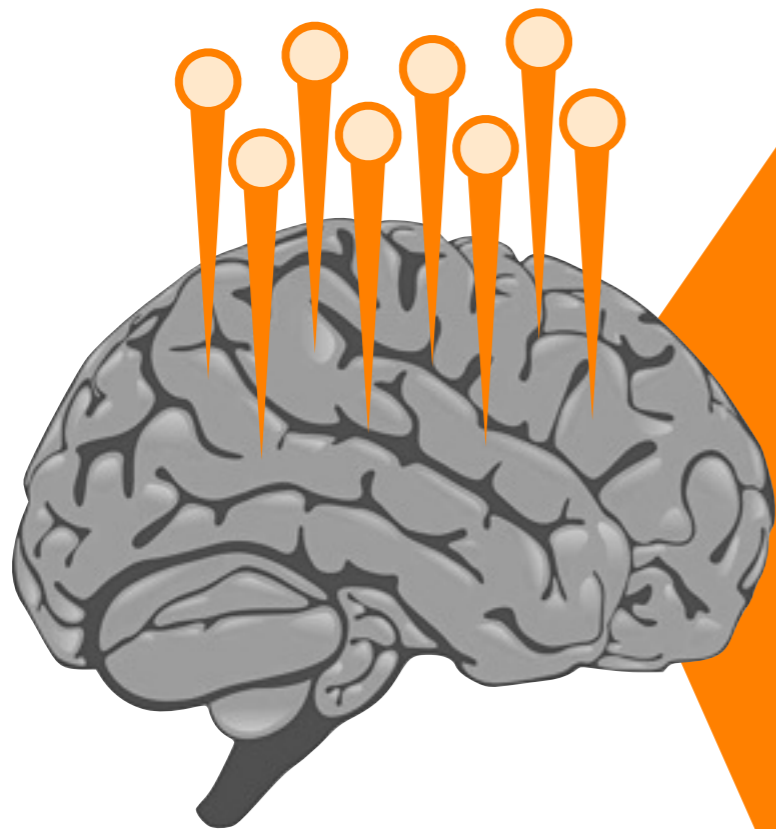
Alright, here's what  
I found for  
"baking squid pancakes"



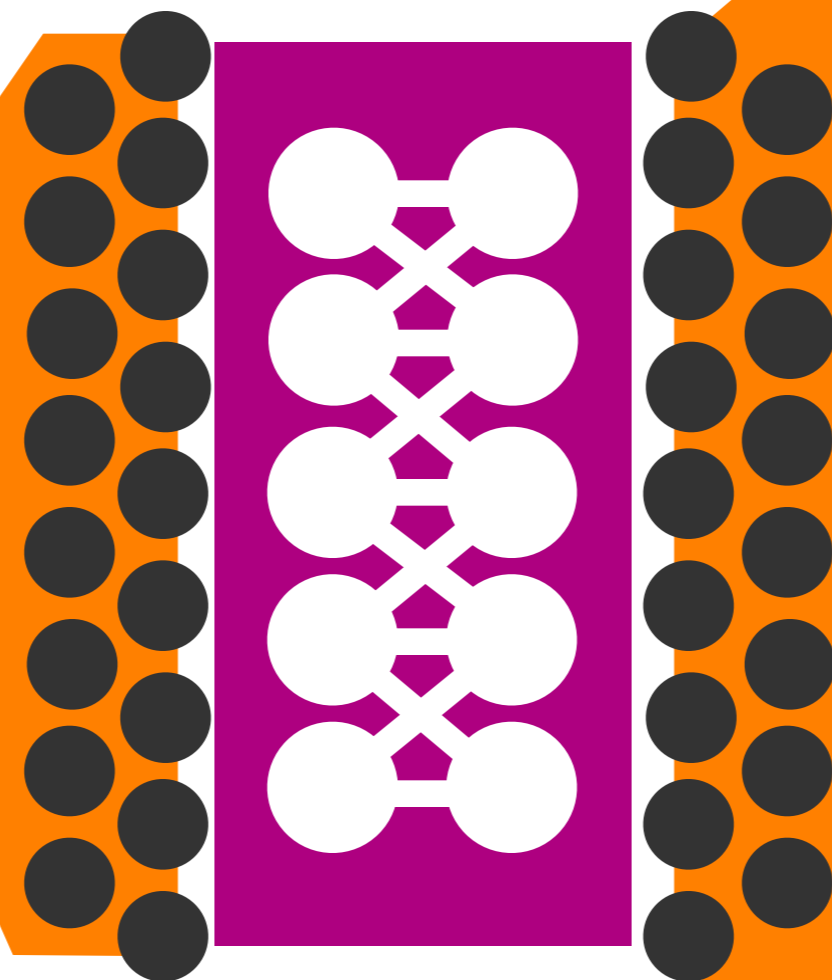
Alright, here's what  
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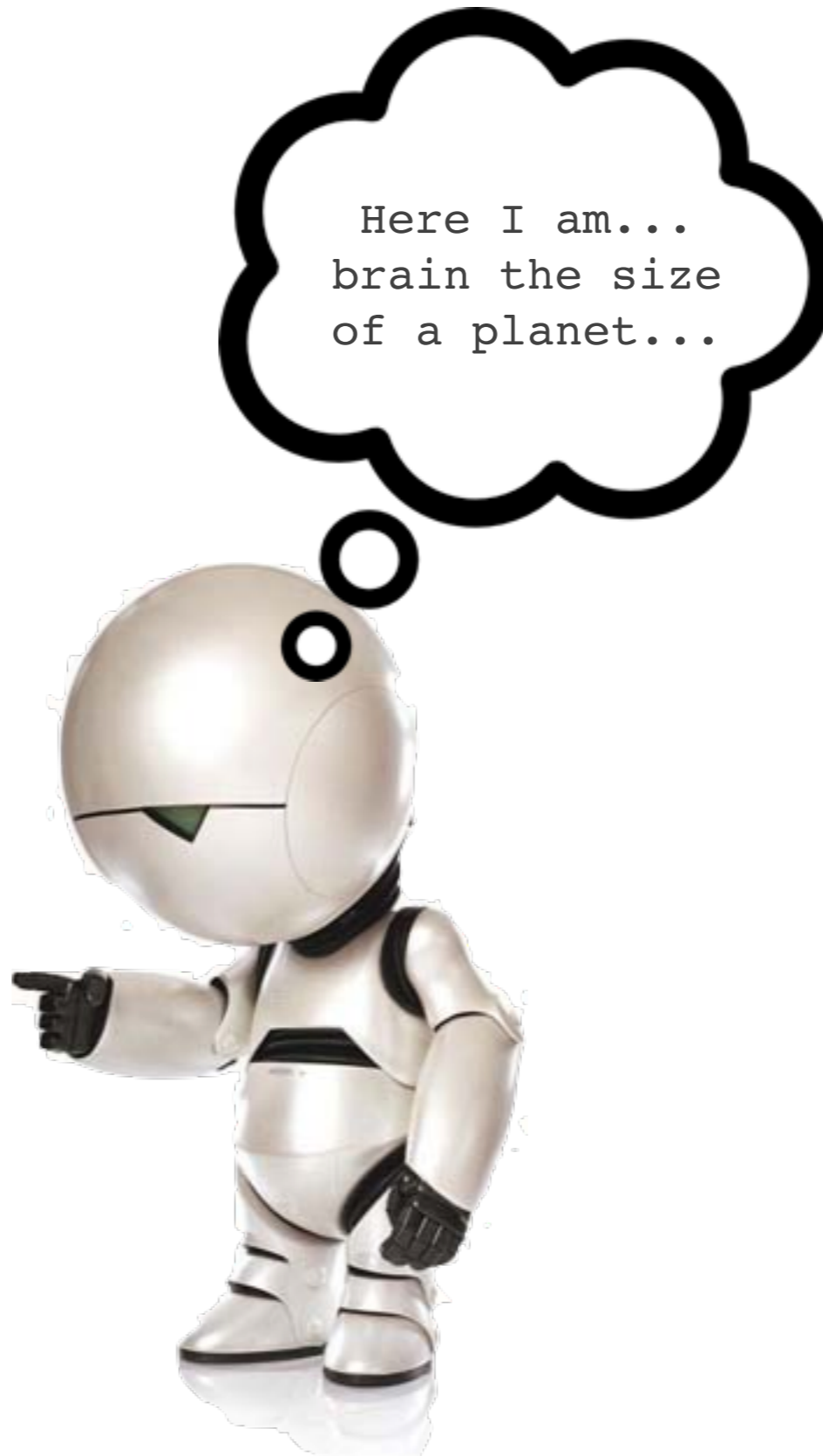
Texting "squid-cake  
recipe" to your mother.  
Ready to send?





Human Mind





**Marvin the paranoid android from THHGTTG.**

# Overview

- AI and IA give us different views on the same problems; happily, approaches that enable one also enable the other.
- Both give us the ability to focus on important subproblems, most (all?) of which rely on combining representation, prediction, and control (learning and planning).



# Overview

- IA allows us to specifically address communication: the connection of two complex, intelligence systems to achieve in ways a single system could not.
- IA seems like a reasonable approach to crafting, understanding, and inviting advanced intelligence (biological, synthetic, or some combination of the two).

# Closing Thoughts

- Thanks to advances in multiple fields, we now have an excellent opportunity to study intelligence (representation, prediction, and control) through the lens of physical, sensory, and cognitive enhancement.
- A suggestion for future effort: we have prediction and control on the run; let's now get a solid handle on representation learning.



# Questions

... with thanks to many colleagues,  
students, and collaborators

... and thank you very much  
for your attention.

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<http://www.ualberta.ca/~pilarski/>