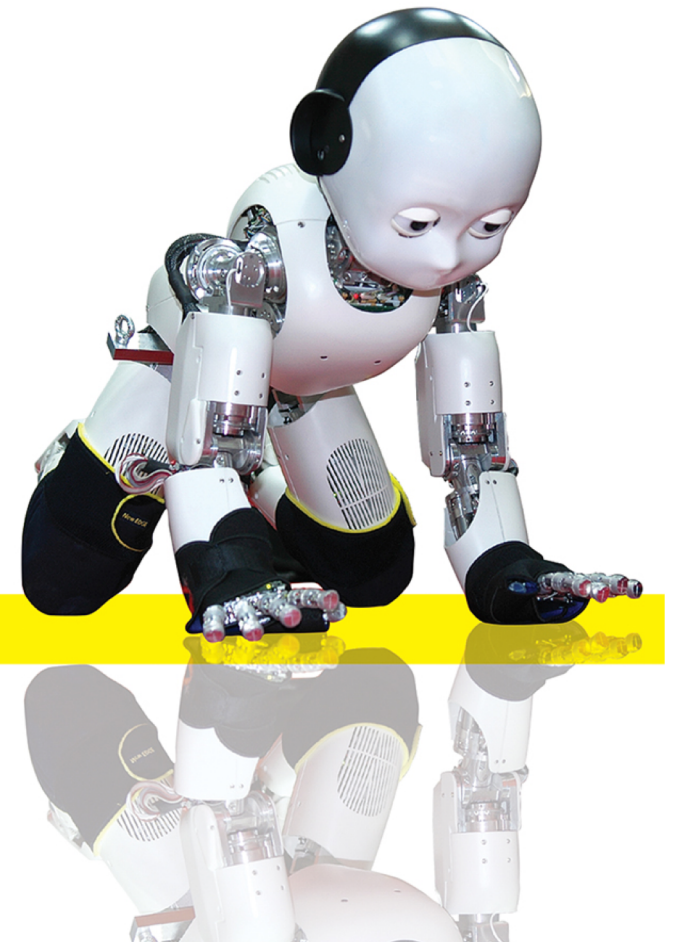


# DEVELOPMENTAL ROBOTICS

Language Learning, Trust and Theory of Mind

Angelo Cangelosi  
University of Manchester



MANCHESTER  
1824

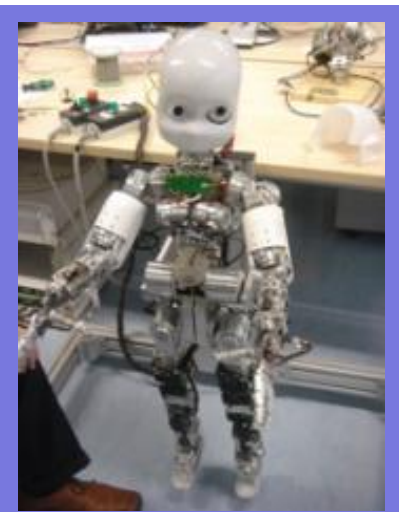
The  
Alan Turing  
Institute

The University of Manchester

# Robots, Language & Cognition

How can we **design robots** that are capable of using language to communicate with humans and other robots?

What can cognitive scientists **learn from robot experiments** on embodied language learning?





***Gavagai***

*Quine (1960)*

# Talking to Robots

- Computers and robots can be easily **pre-programmed** to memorise a dictionary, but cannot understand the language they use

Hello, I am  
Eliza



Siri. Beta

Your wish is  
its command.



```
File Edit Options Buffers
I am the psychotherapist.
you are finished talking,

Hello world

How do you do? What brings

I have a terrible pain in

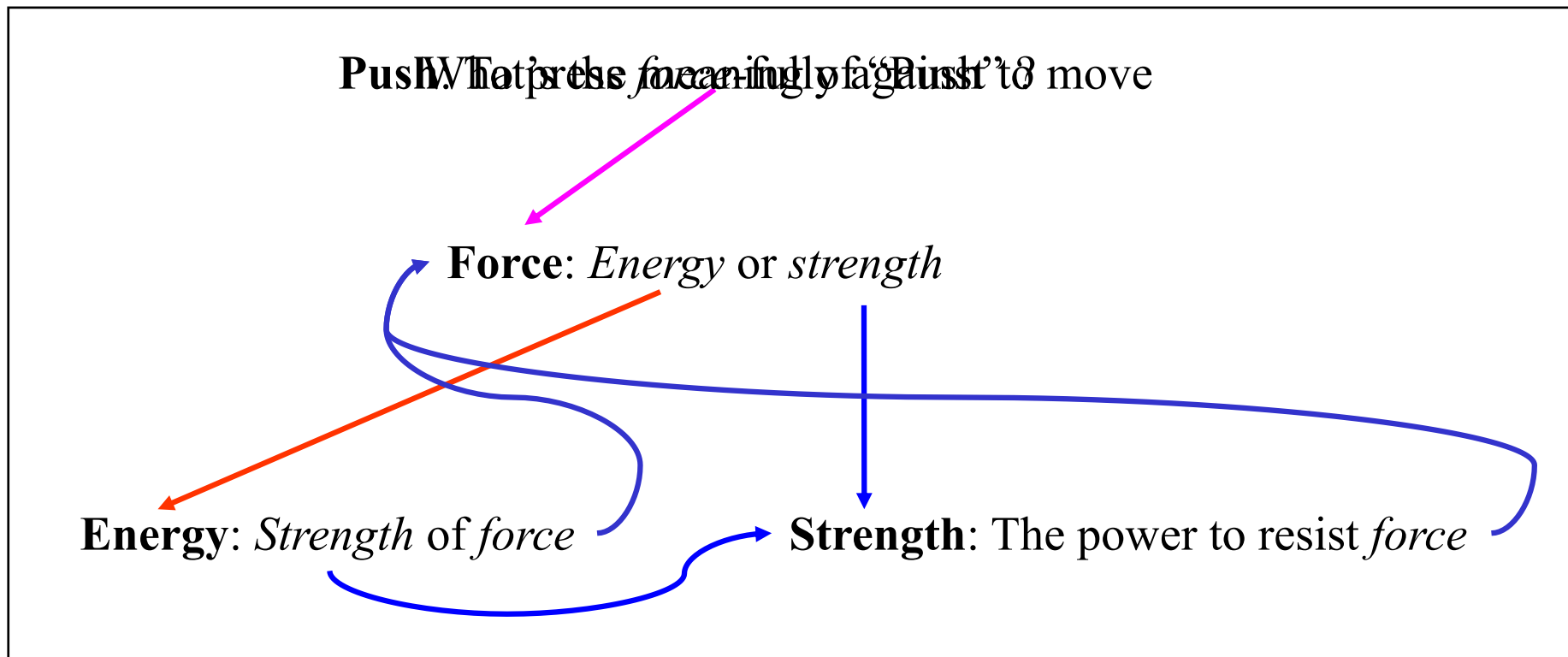
Maybe you should consult a
```



Hi. I'm Cortana.



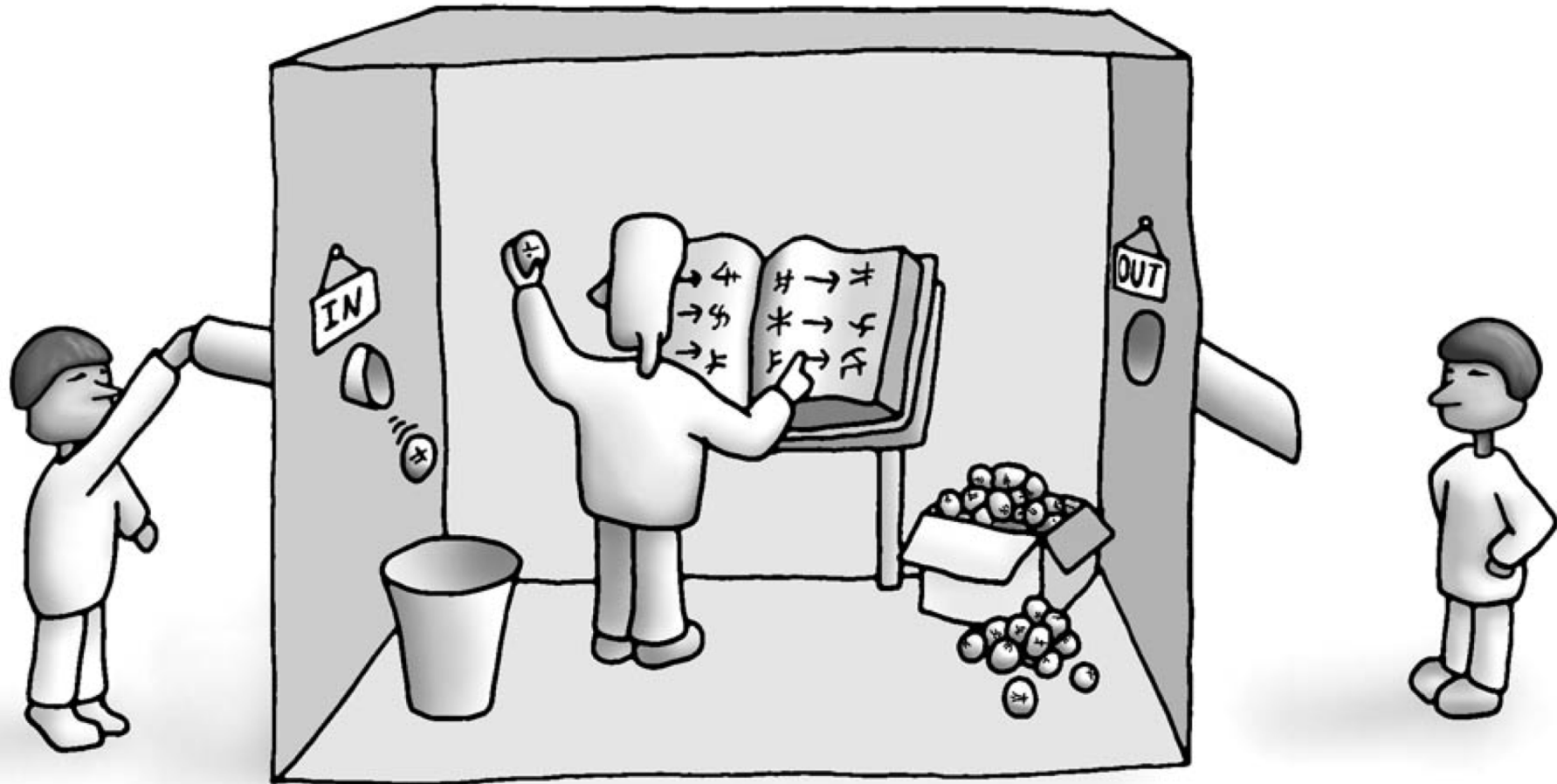
# "Merry-Go-Round" of Amodal Symbol Systems



Example of self-referential, amodal network of word definitions in Webster's Dictionary (Roy 2005)  $\Rightarrow$  Chinese Room (Searle 1980)

# Chinese Room Thought Experiment

(Searle 1980)



jolyon.co.uk

Searle, J.(1980), "Minds, Brains and Programs", Behavioral and Brain Sciences 3 (3): 417–457  
Harnad, S (2005), "Searle's Chinese Room Argument", Encyclopedia of Philosophy, Macmillan

# Talking to Robots

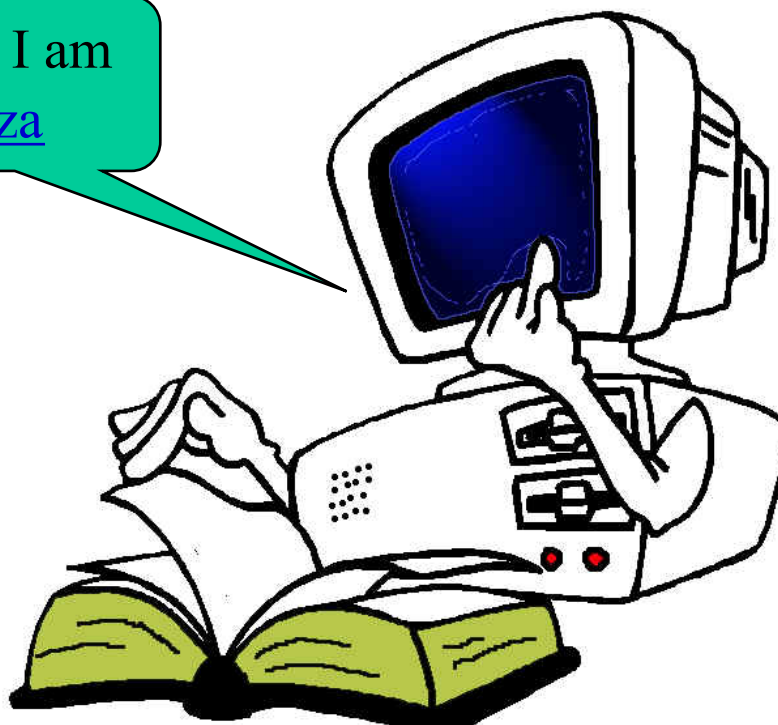
- Computers and robots can be easily **pre-programmed** to memorise a dictionary, but cannot understand the language they use

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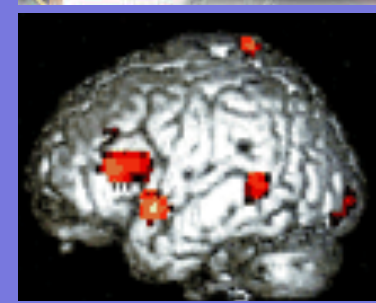
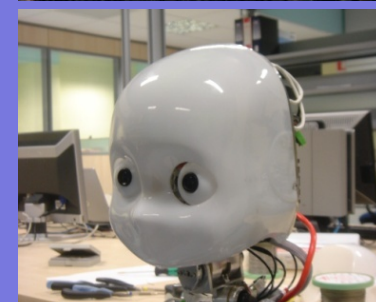
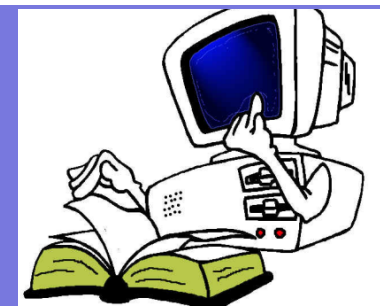
Hi. I'm Cortana.



# Learning & Development

Robots can be easily **pre-programmed** to memorise a dictionary, **but** cannot fully understand the language they use

- ✓ Children are **slow**, but efficient at learning a language (vocabulary spurt) (Tomasello 2008)
- ✓ Children use their **body** for situated interaction (Smith & Samuelson 2010)
- ✓ The **brain** integrates language and sensorimotor knowledge (Pulvermueller 2003)
- ✓ Children develop **Theory of Mind** (ToM) for social interaction





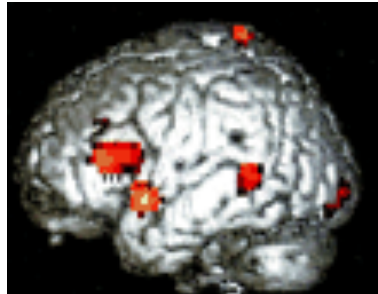
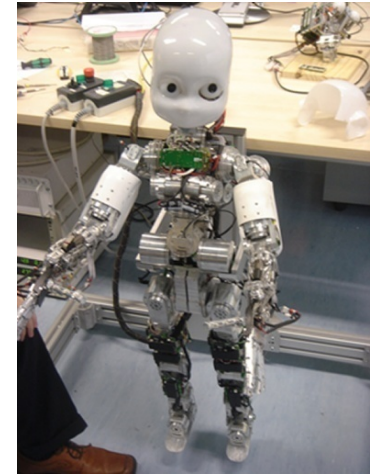
Ethology



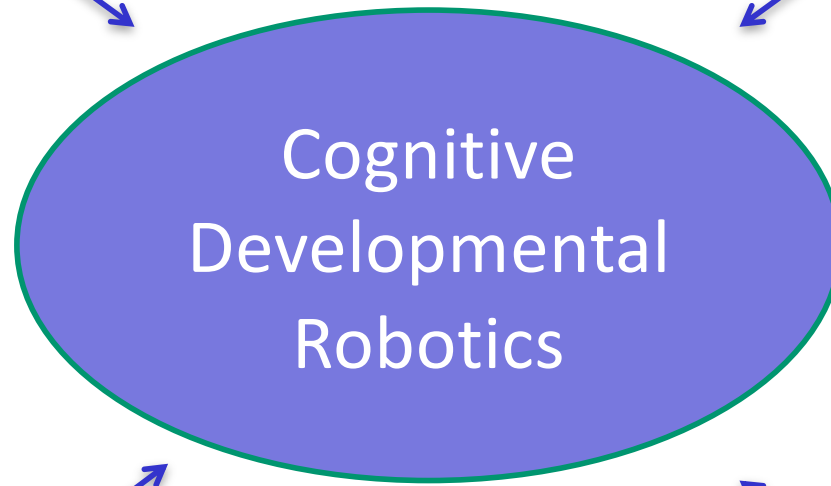
Computer science



Robotics



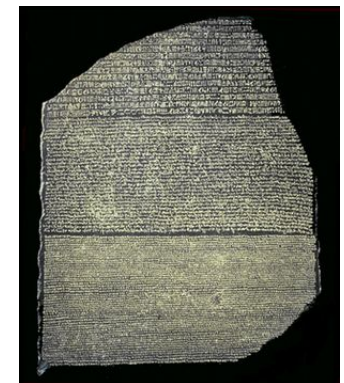
Neuroscience



Child Psychology



Cognitive Psychology

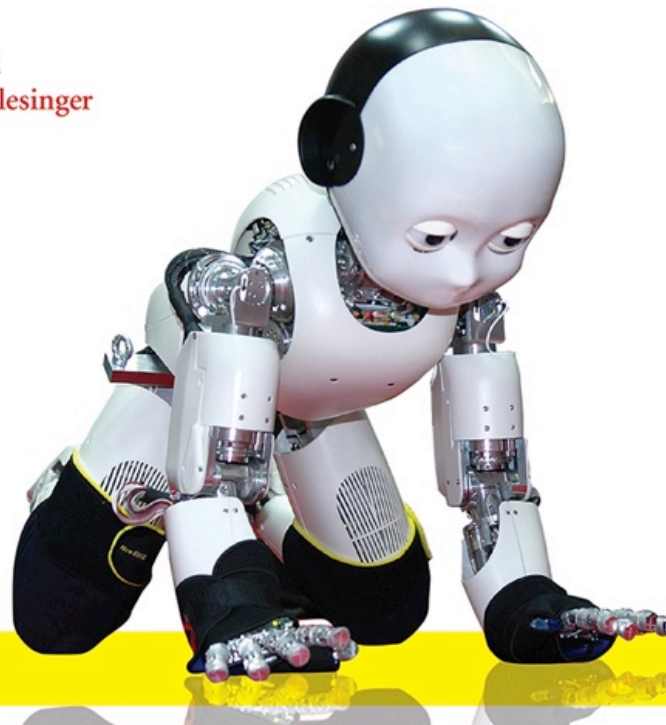


Linguistics

# DEVELOPMENTAL ROBOTICS

From Babies to Robots

Angelo Cangelosi  
and Matthew Schlesinger





Article

## From Babies to Robots: The Contribution of Developmental Robotics to Developmental Psychology

Angelo Cangelosi , Matthew Schlesinger

First published: 20 February 2018 | <https://doi.org/10.1111/cdep.12282> | Citations: 14

Angelo Cangelosi, Plymouth University and Manchester University; Matthew Schlesinger, Mattel Inc. The work of Angelo Cangelosi was supported by the EU H2020 Marie Skłodowska-Curie projects APRIL (674868) and DCOMM (676063).

[Read the full text >](#)



PDF



TOOLS



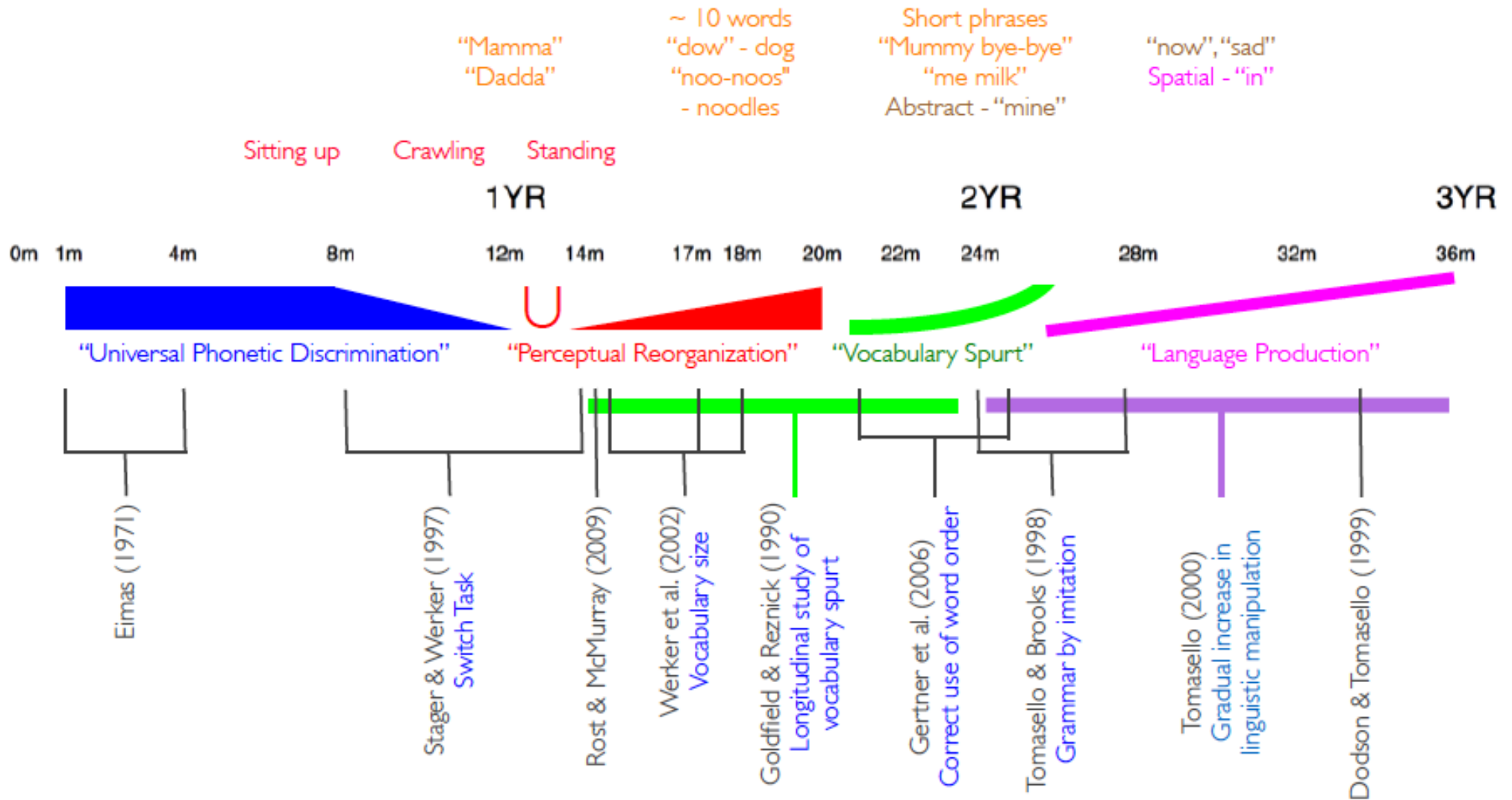
SHARE

### Abstract

The latest developments in artificial intelligence (AI) and machine learning, and the parallel advances in robotics, have contributed recently to a shift in the scientific approach to modeling human intelligence. These innovations, accompanied by the new emphasis on embodied and grounded cognition in AI and psychology, have led to the establishment of the field of developmental robotics. This field features an interdisciplinary approach, built on collaboration between cognitive robotics and child psychology, to the autonomous design of behavioral and cognitive capabilities in artificial cognitive agents, such as robots, which is inspired by developmental principles and mechanisms observed in children. In this article, we illustrate the benefits of this approach by presenting a case study of a baby robot with a focus on the role of embodiment during early word learning, as well as an overview of several developmental robotics model of perceptual, social, and language development.

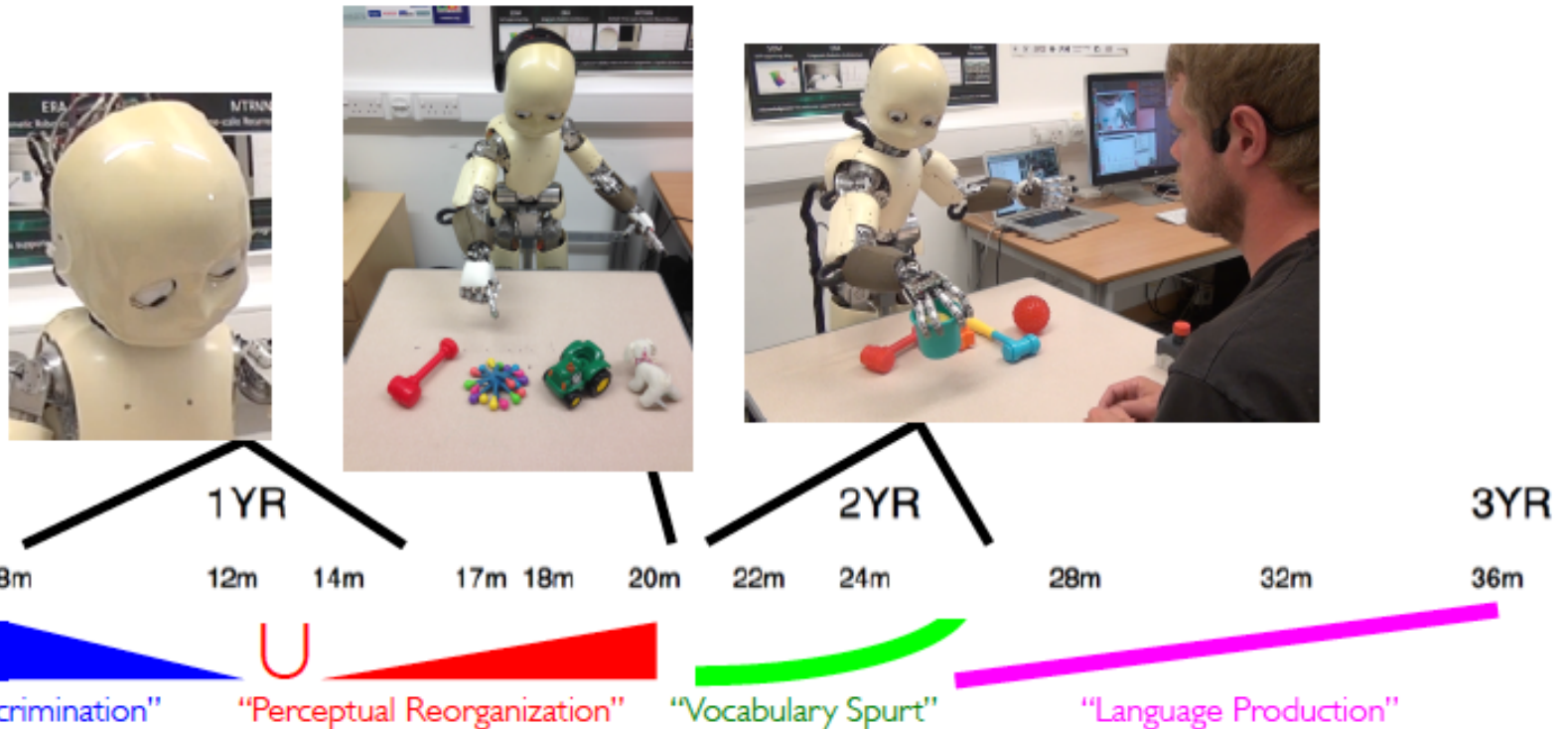
# ***Embodied Language Learning***

# Developmental Psychology of Language Acquisition



# ***Developmental Robotics** ***of Language Acquisition****








- Cognitive architecture for cumulative learning
  - 5+ Experiments: first words, mutual exclusivity, U-learning, word order, trust ...
  - **Collaboration with BabyLabs:** Smith (Indiana), Horst (Sussex), Floccia/Cattani (Plymouth), Twomey (Manchester), Antonelli (Milan Cattolica)

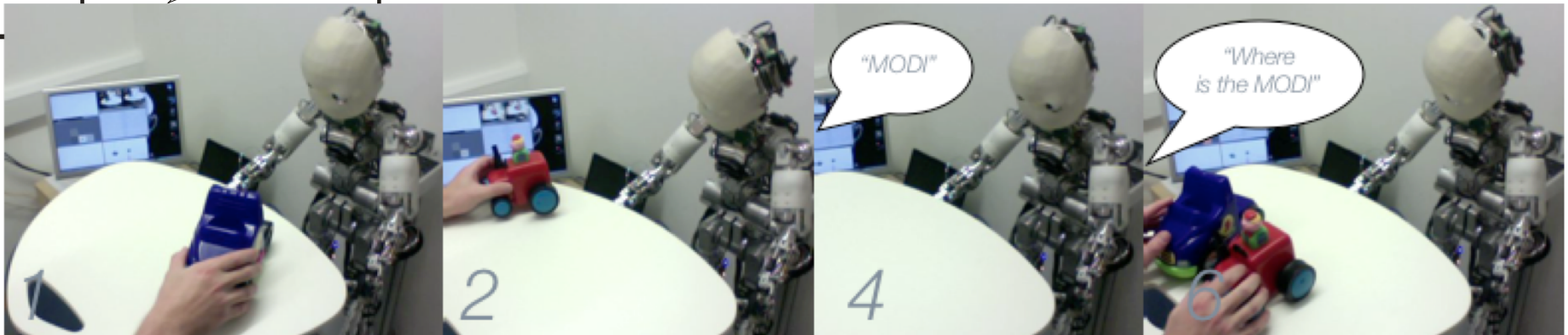


# ***Posture Affects Word Learning***



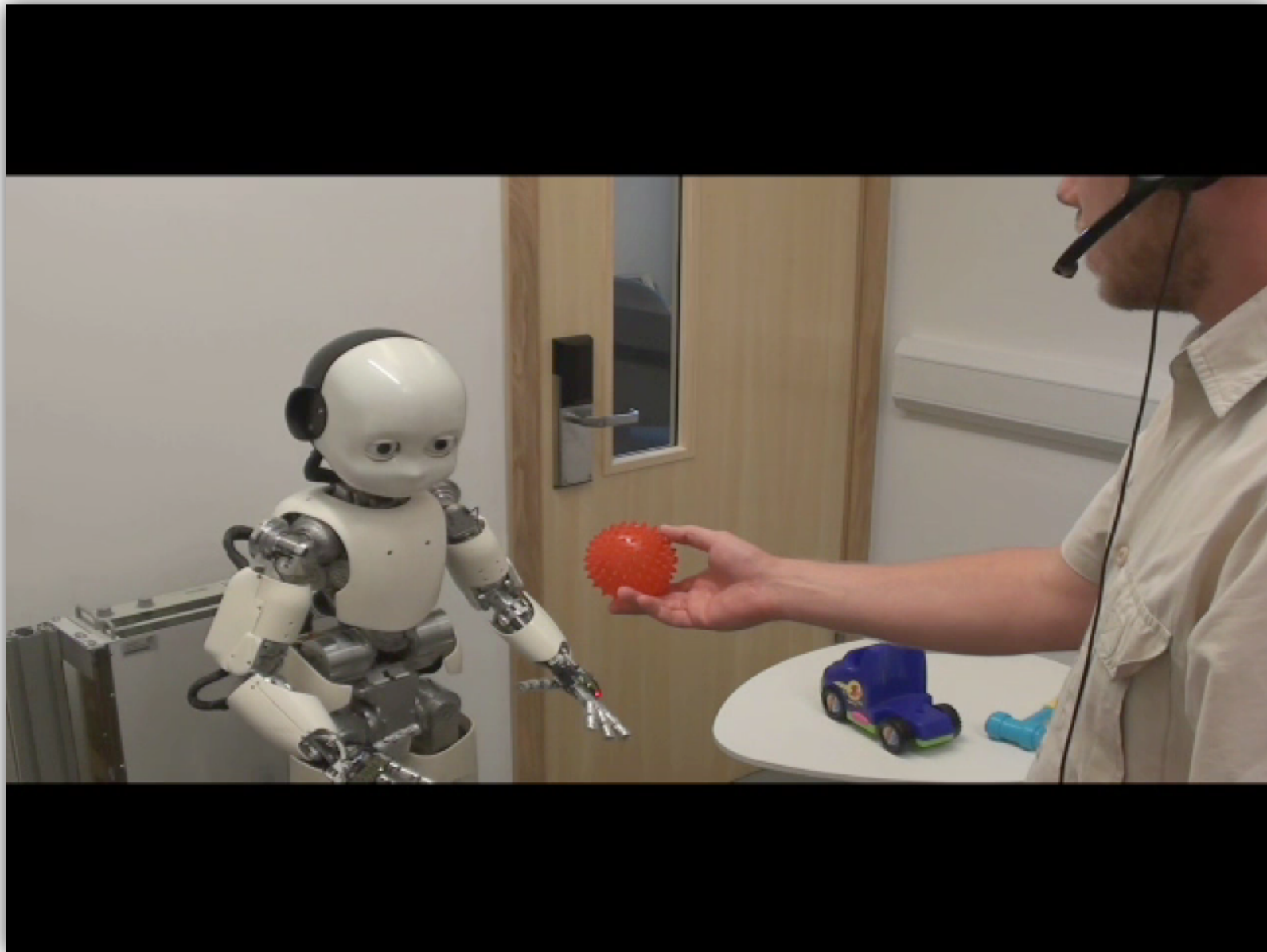
Smith & Samuelson (2010); Morse, Cangelosi, Smith et al. (2015)

	Left	Right
Step 1		
Step 2		
Step 3		
Step 4		
Step 5	<div data-bbox="331 619 517 703" style="border: 1px solid black; padding: 2px; display: inline-block;"> <i>look at the MODI</i> </div>	
Step 6		
Step 7		
Test	<div data-bbox="465 951 577 1034" style="display: inline-block;">  </div> <div data-bbox="416 1042 629 1126" style="border: 1px solid black; padding: 2px; display: inline-block;"> <i>Where's the MODI?</i> </div>	

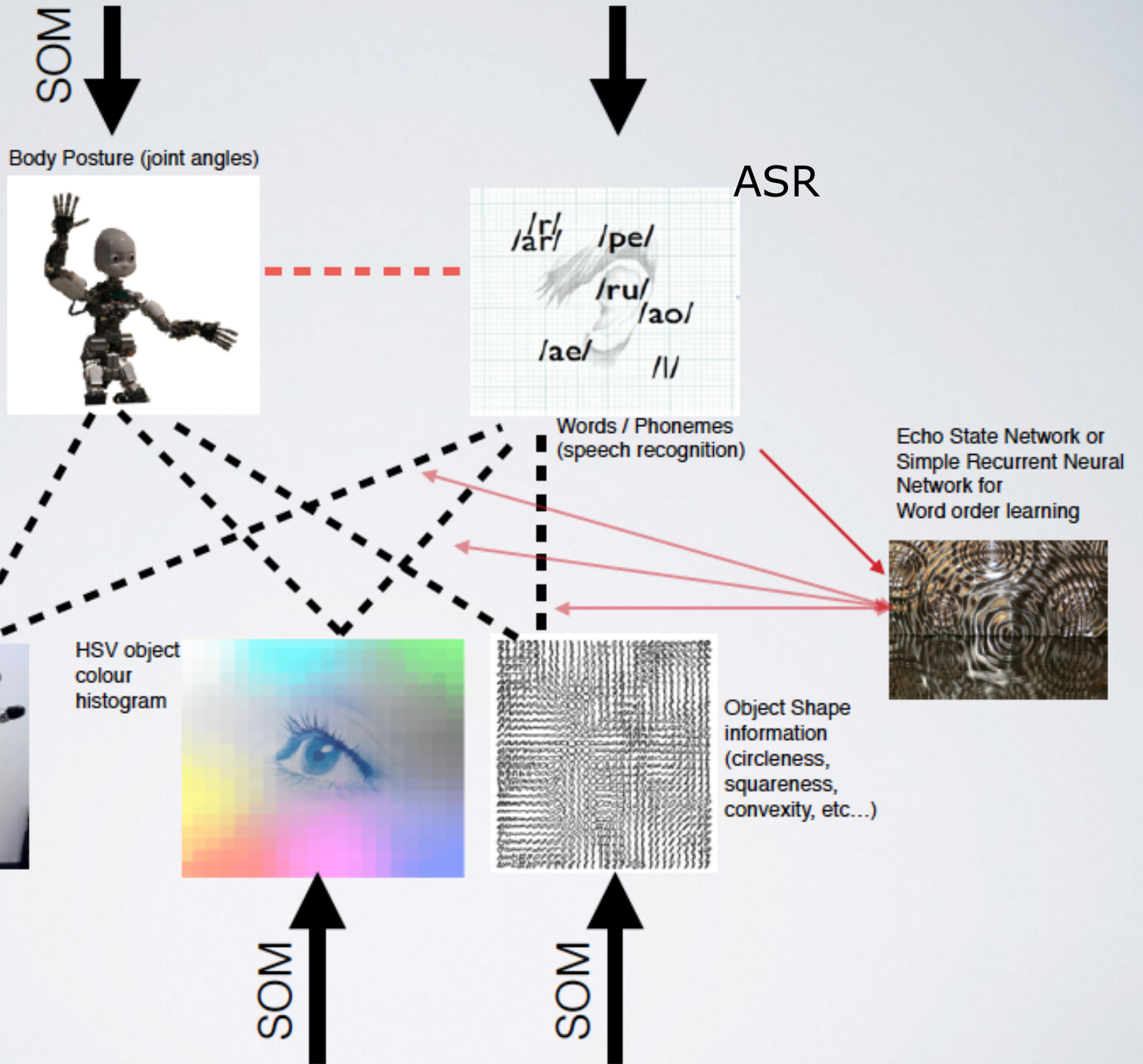




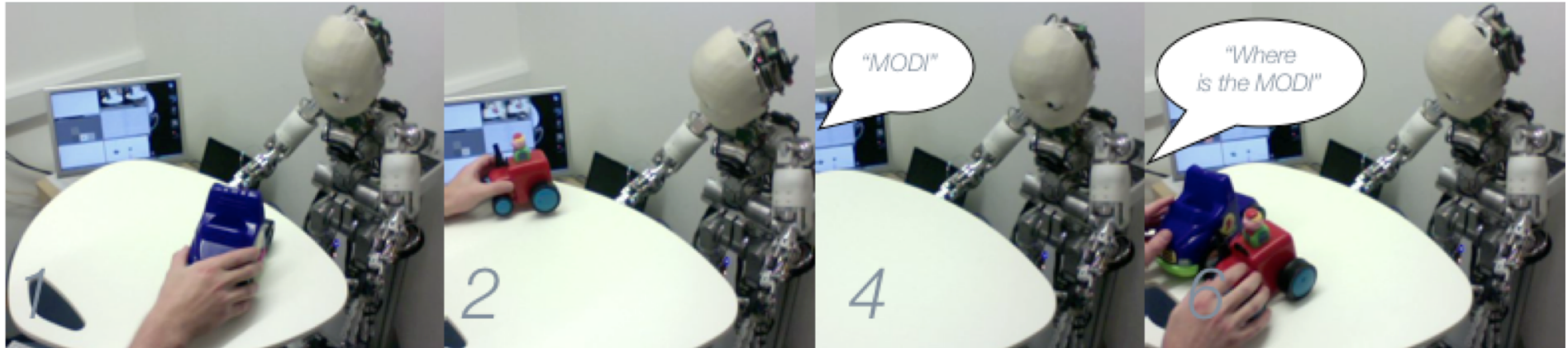
# ***iCub's Modi Experiment***



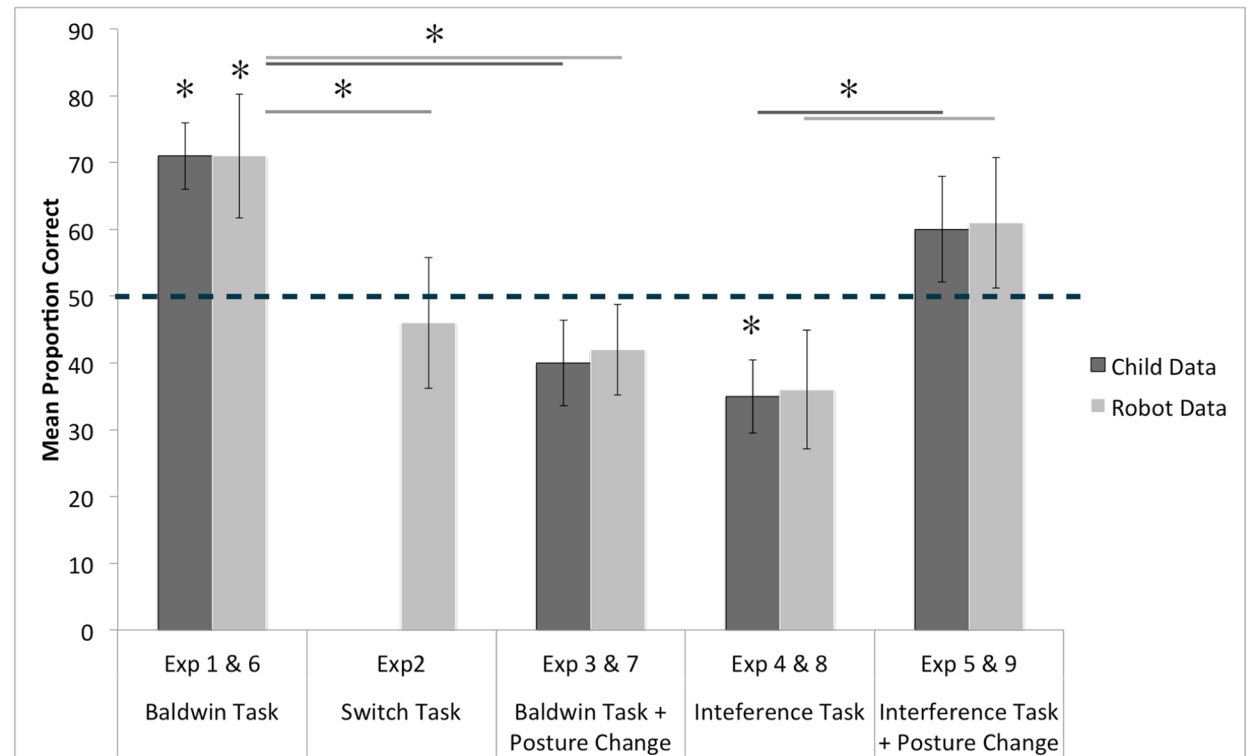
# AI Architecture



# iCub 'Modi' : Predictions

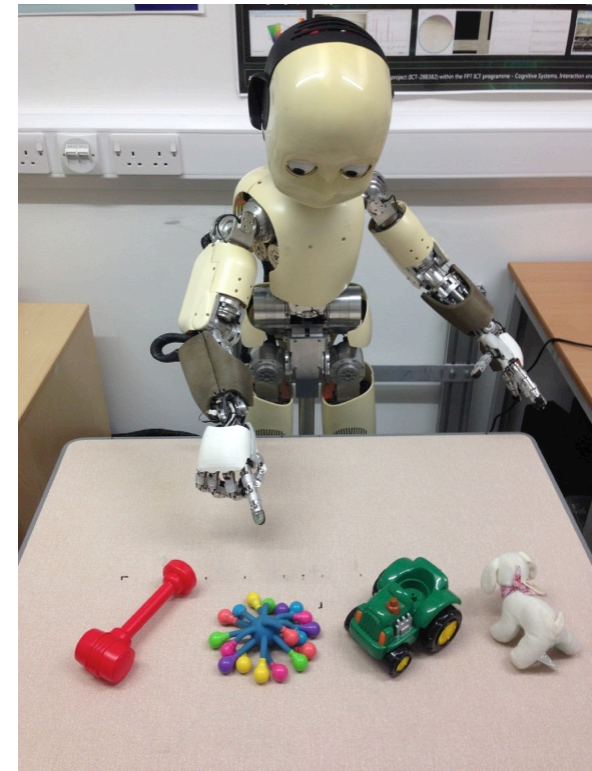
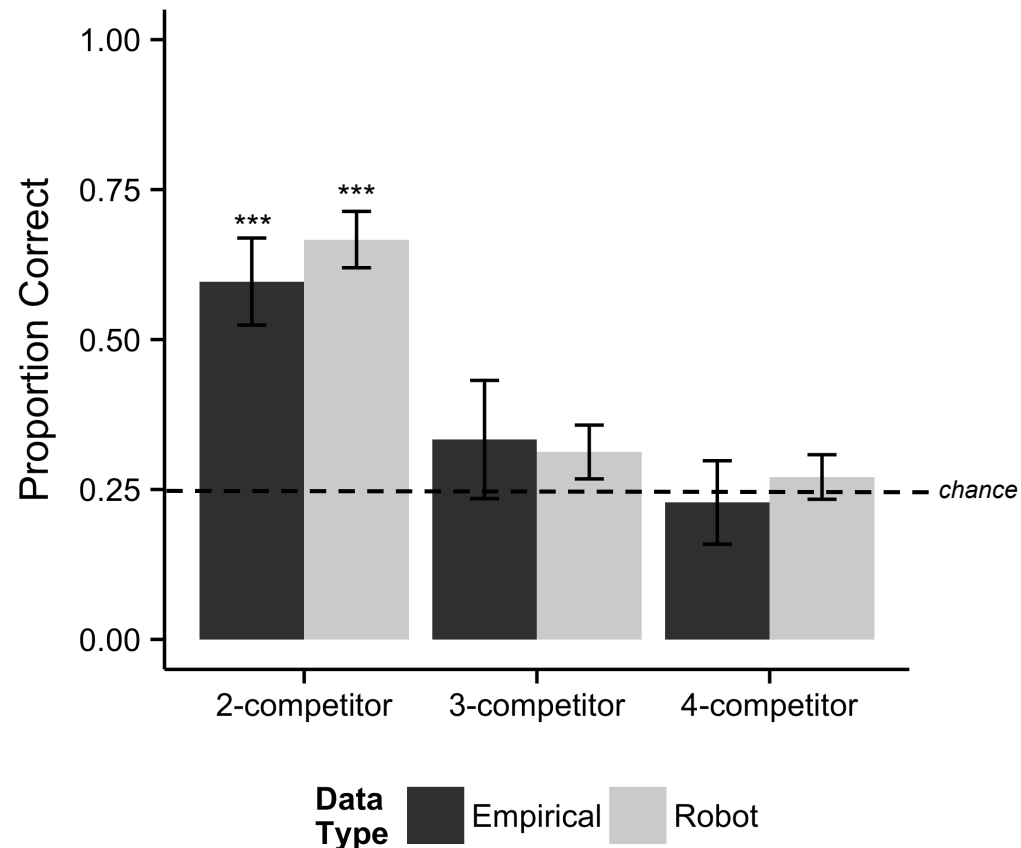


- 6 robot/baby Experiments
- Model prediction
  - Changes in posture (e.g. from sitting to standing) will remove task interference effect despite the target location remaining consistent.

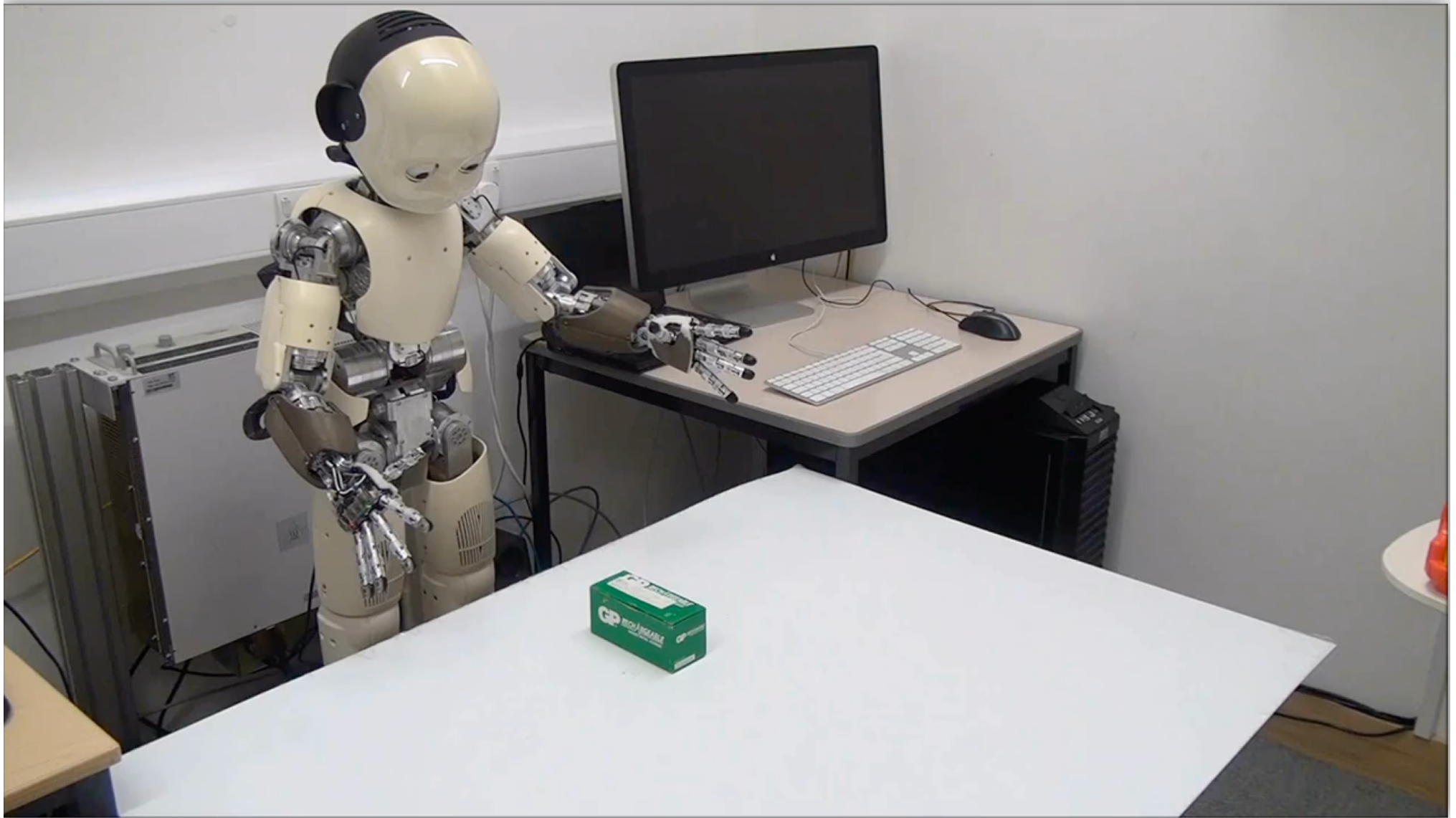


# Mutual Exclusivity

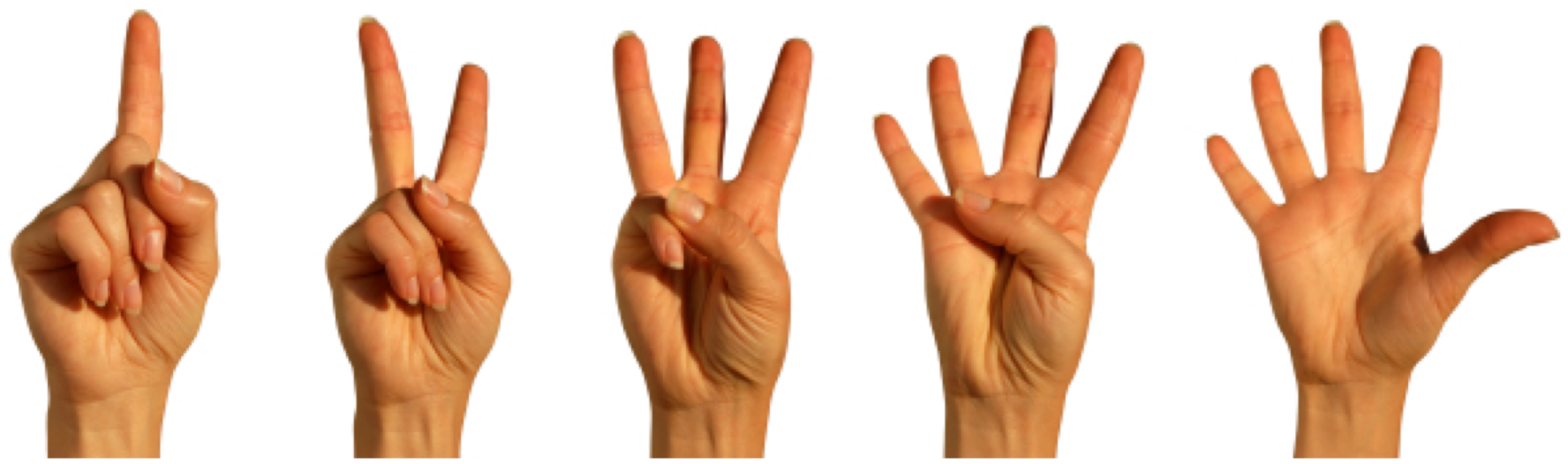
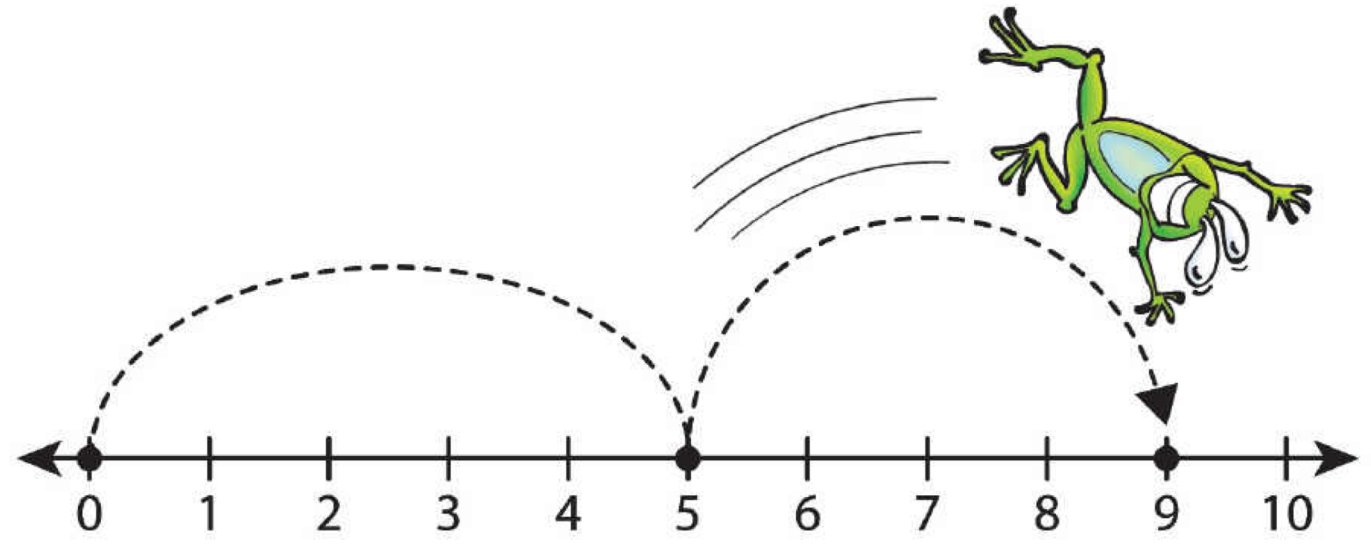
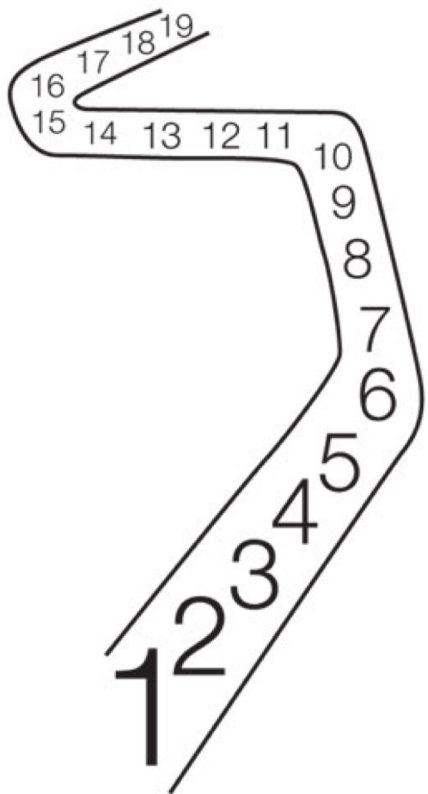
- Mutual exclusivity (Horst et al. 2010)
  - Effects of competitors



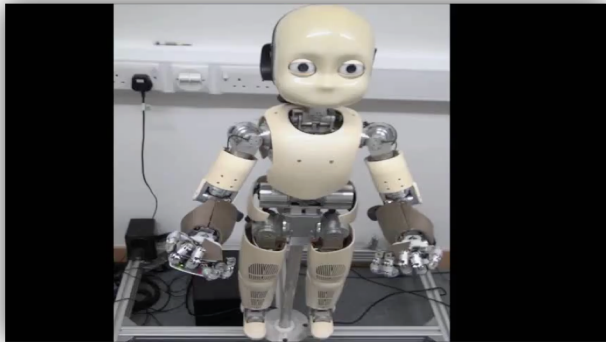
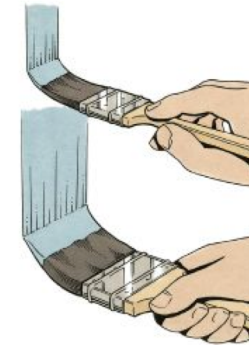
# ***Open-Ended Cumulative Learning***



# ***Learning Abstract Words***

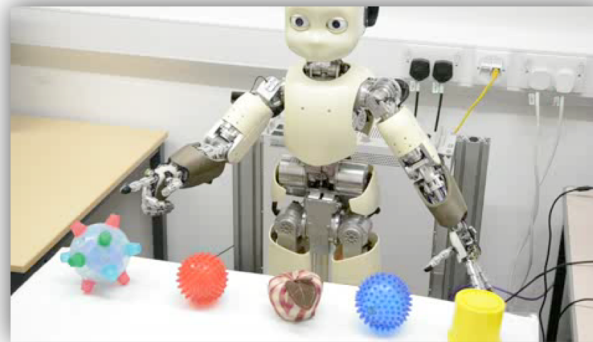


# Learning Abstract Words



Finger counting

De la Cruz et al. (2014)



Gesture and counting

Rucinski et al. (2012)



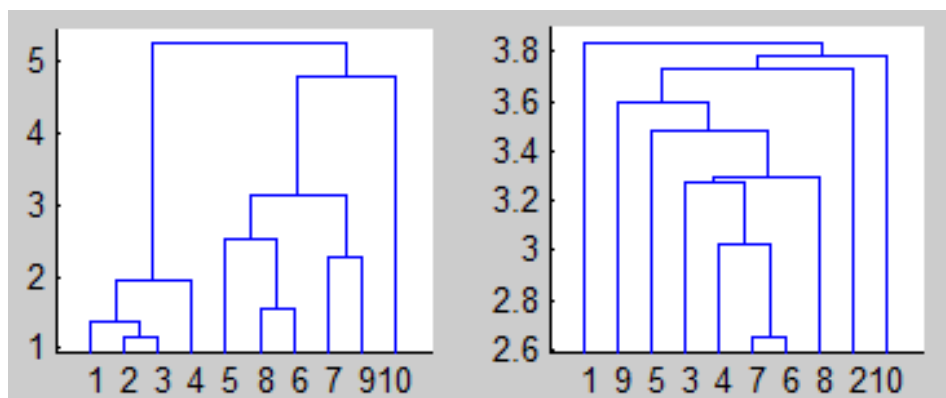
Abstract words:  
Use, Make

Stramandinoli et al (2016)



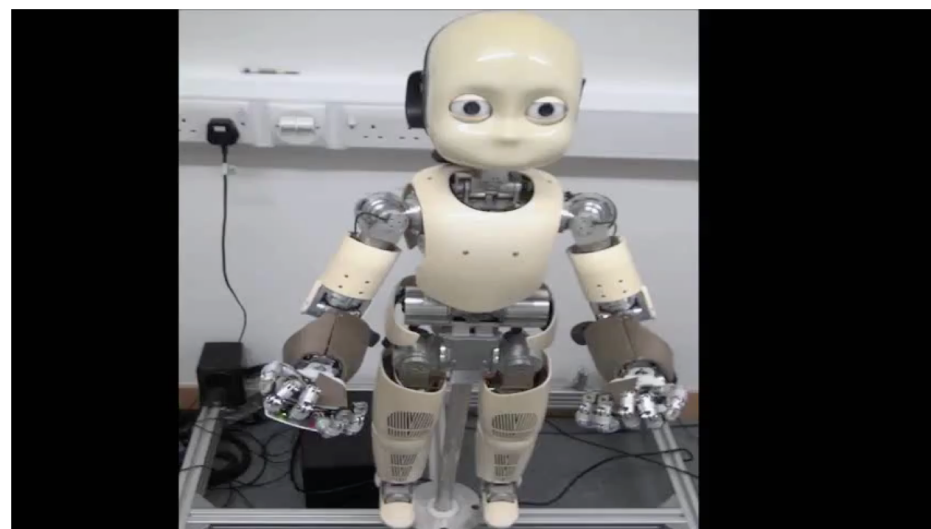
# ***Finger Counting: Model***

- Robot counting its fingers
- Learning architecture (deep neural networks)
  - Finger and number words
- Training
  1. Finger sequence only
  2. Number sequence only
  3. Finger & Number sequences



Finger&Number

Number sequence only



***Trust in HRI***

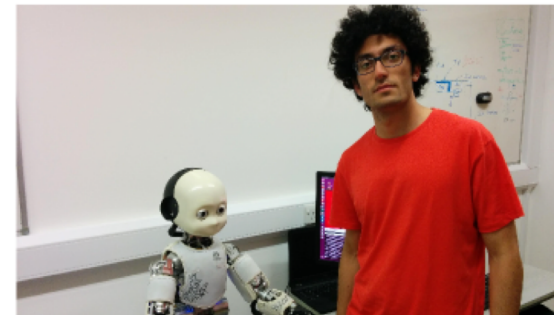
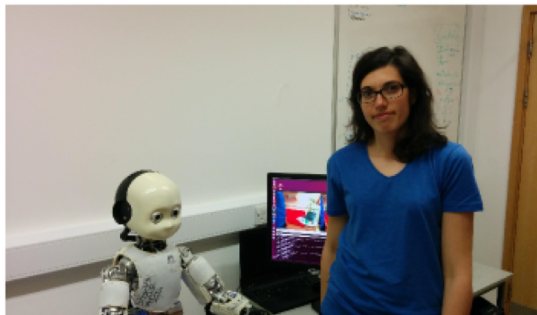
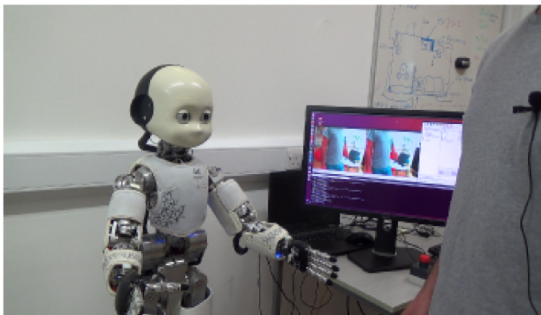
***Theory of Mind and Intention  
Reading***

# ***Trust for Human-Machine Interaction***



- Cognitive architecture for trust in humans and machines
  - Robot's trust of other agents (humans, robots)
  - Human's trust of autonomous robot
- Inspiration from developmental psychology experiments on Theory of Mind (ToM) and Trust
  - Bayesian model for belief and ToM
- HRI experiments on social and anthropomorphic factors in trust

Who was unreliable?



# *Trust for Human-Robot Interaction*



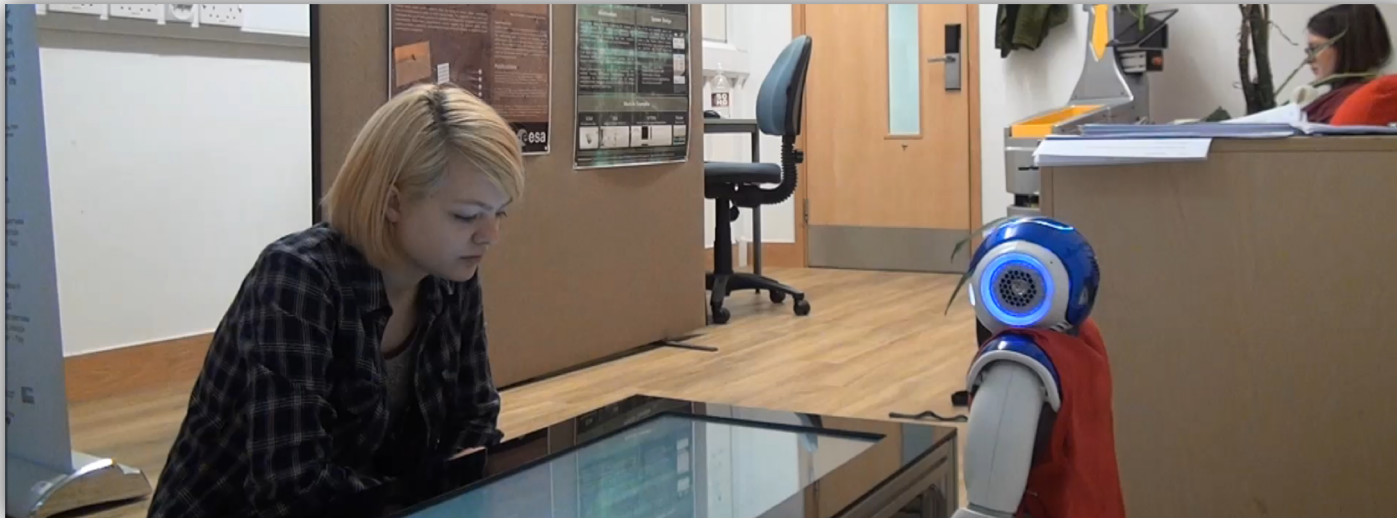
THRIVE



- Price judgement game

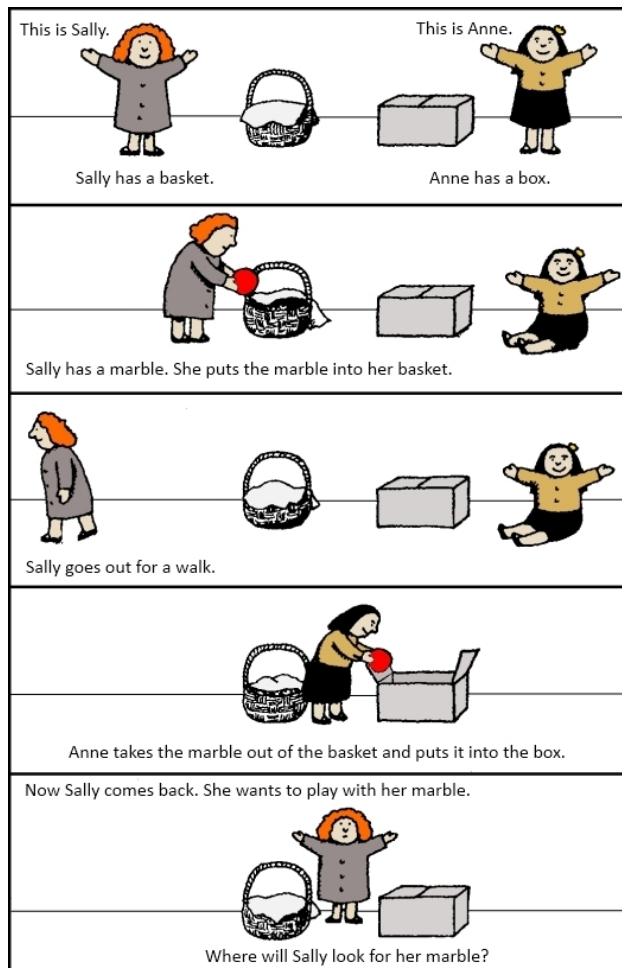


- Investment game



# Development of ToM (Theory of Mind)

- Wimmer & Perner (1983). "Beliefs about beliefs: Representation and constraining function of wrong beliefs in young children's understanding of deception". *Cognition*



## Sally-Anne test

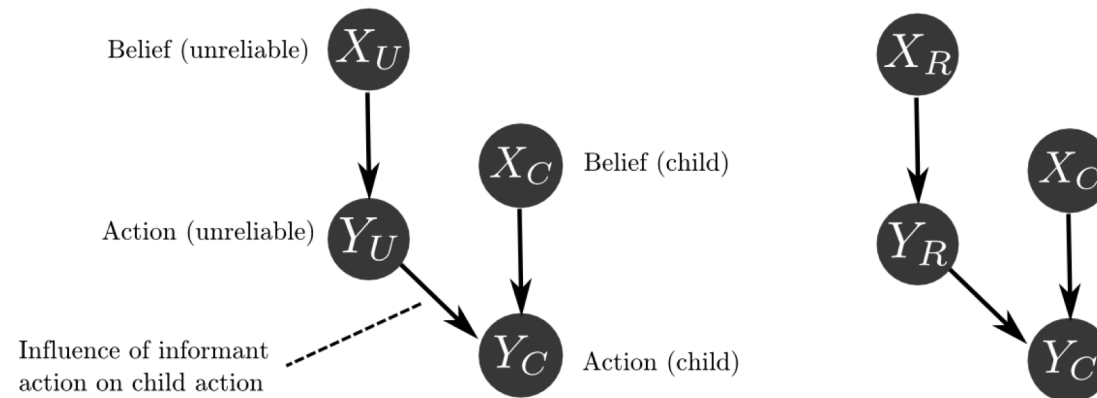
- Sally puts an object into a location x
- In her absence, Anne moves the object to location y.
- Anne returns
- Child asked where Anne believes the object is

## Results – deception detection:

- None of the 3-4-years old children
- 86% of 6-9-years old children

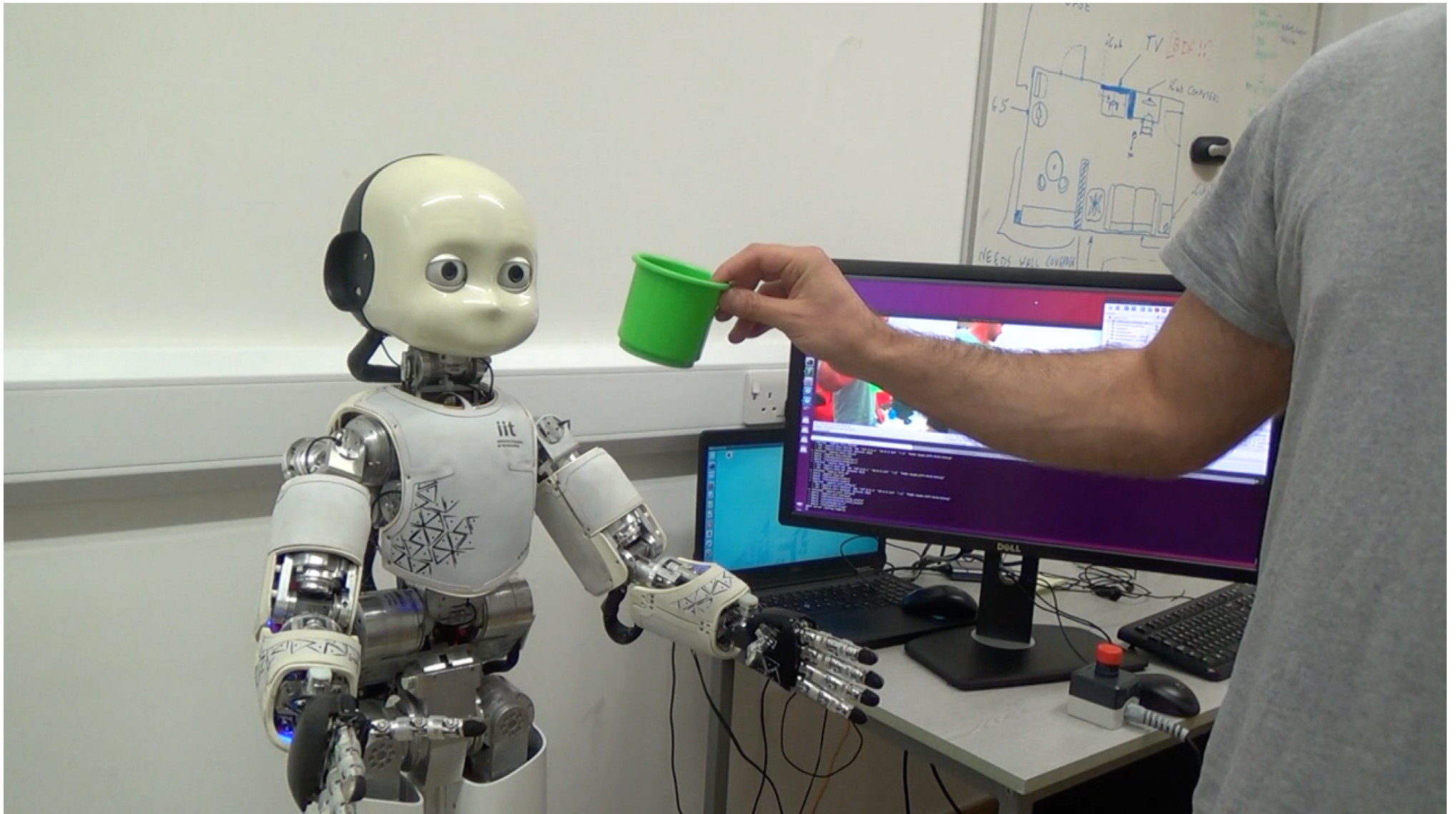
# Bayesian ToM Trust Model

- Bayesian Network (BN): Separate BN for reliable (R) and unreliable (U) speaker
- The action of the child is a consequence of her internal belief  $X_C$  and the informant's action  $Y_R$  or  $Y_U$ .

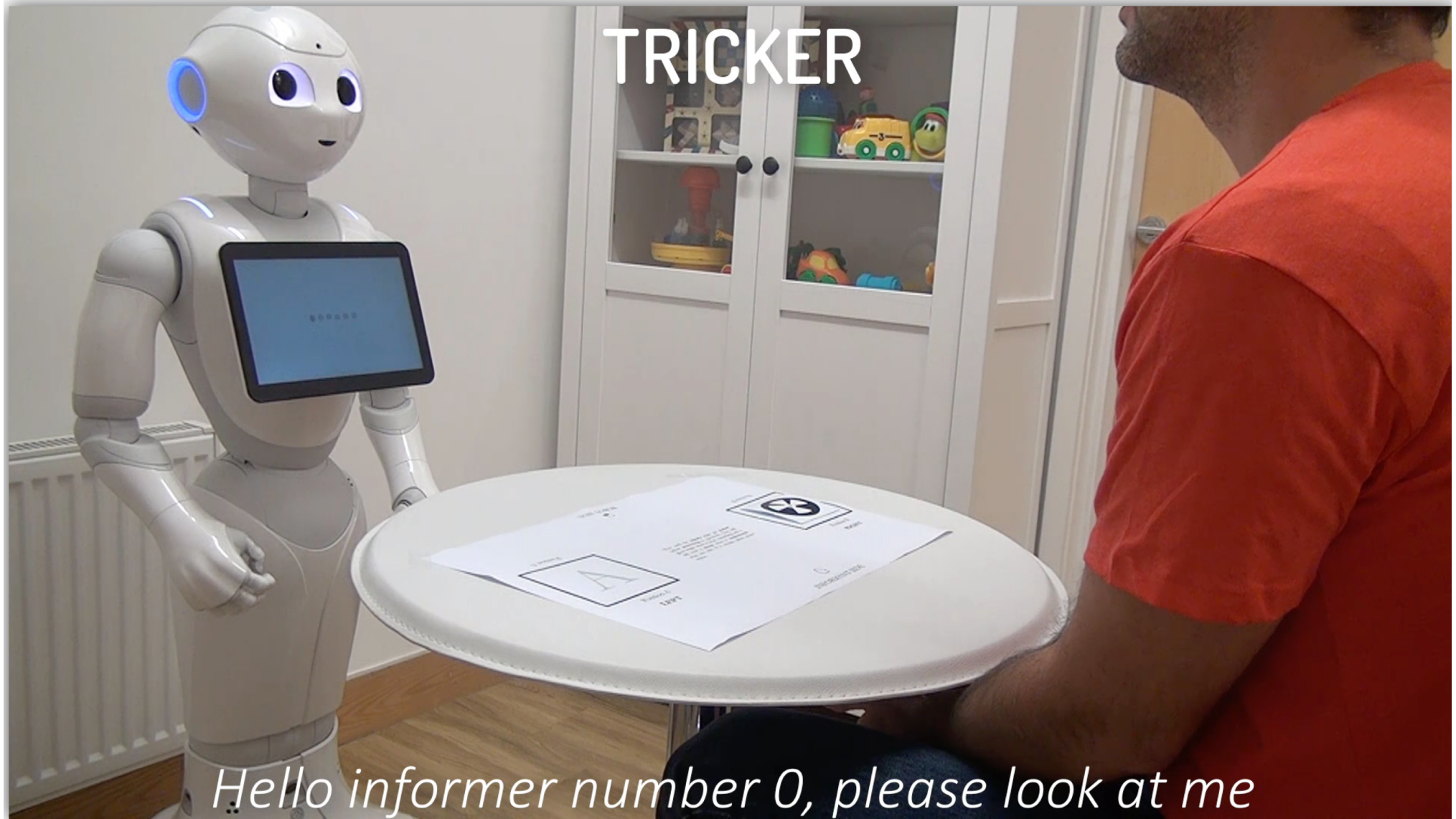


- Children collect statistical information for tracking the reliability of agents (MLE Maximum Likelihood Estimation for the setting of BN parameters).

# ***iCub Trust and Language***



# ***Trust in Human-Robot Interaction***





# *Intention Reading*

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Honda Research Institute EU

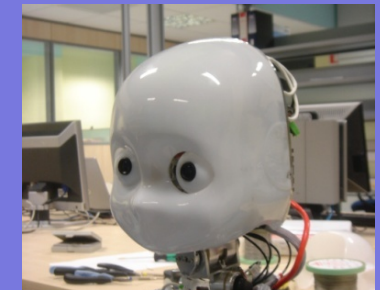
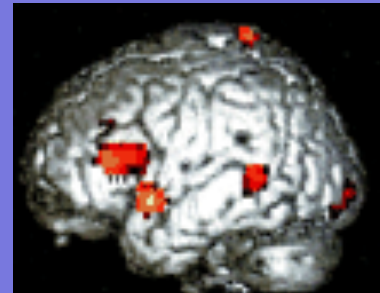
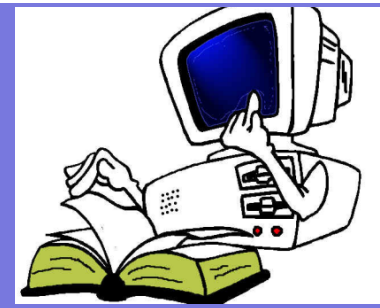
## Mindreading for Robots

Predicting Intentions via Dynamical Clustering of Human Postures

S. Vinanzi, C. Goerick, A. Cangelosi

# ***Take Home Message***

- Developmental approaches
  - Embodiment cues in development
  - Multiple developmental phenomena
  - Close match with empirical data
  - ToM and Intention reading
- Open challenges
  - Open-ended learning and larger lexicons
  - Explanatory AI for Trustworthy Robots
  - Brain models of social/language development
  - Robot companion and personal robotics applications



# CoRo Lab @ UoM

