



# iCUB

a shared platform for  
research in robotics & AI

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Social Robotics Lab

<http://alecive.github.io>

# IIT - Italian Institute of Technology

Italy



Genoa



IIT

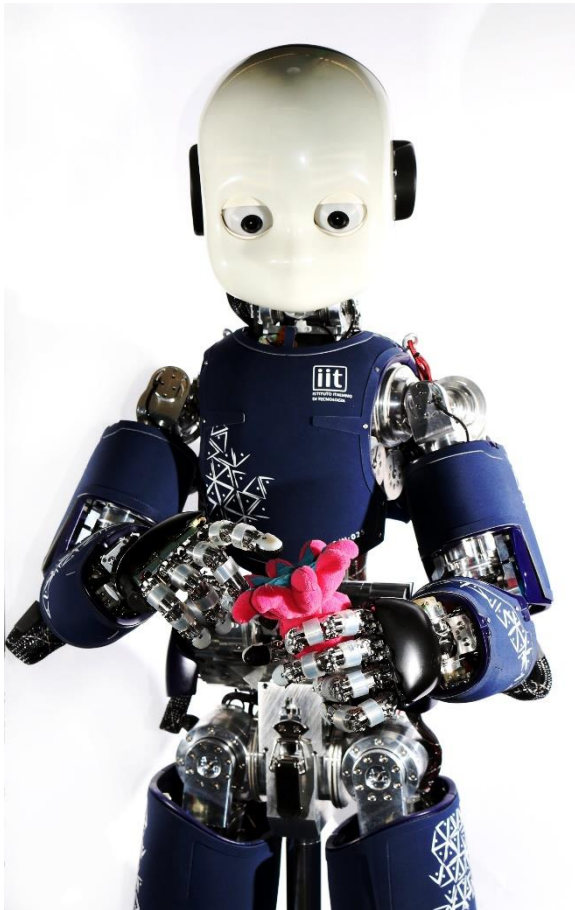


Robotics @ IIT

# IIT - iCub Facility



# The iCub



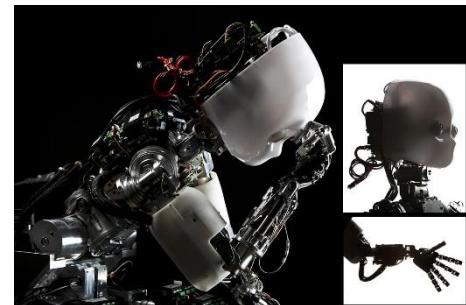
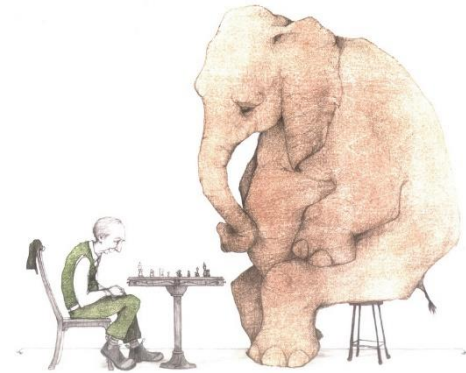
1. price: 250K€
2. born in 2004
3. 30 iCub distributed since 2008

# Why is the iCub so special?

- Full **humanoid** robot (104cm, 25 kg)
- **53** degrees of freedom (DoFs)
- **Hands**: 5 fingers, 9 degrees of freedom, 19 joints
- Human-like **sensors**: cameras, microphones, joint encoders, IMUs (accelerometer/gyroscope), force/torque sensors
- Artificial **skin**
- Large **software repository** (~2M lines of code)
- **Open source** HW & SW

# Why humanoids?

- Scientific reasons (elephants don't play chess)
- Natural human-robot interaction
- Challenging mechatronics



# Why open source?

- Repeatable experiments
- Benchmarking
- Quality of the HW & SW
- This resonates with **industry-grade R&D** in robotics

# Why open source?



ubuntu.

Google

ORACLE®



Alfresco



MySQL®

THE  
LINUX  
FOUNDATION



redhat.



ANDROID

facebook





# Outline

## Hardware

Force/Torque Sensor

Artificial Skin

Inertial Sensor

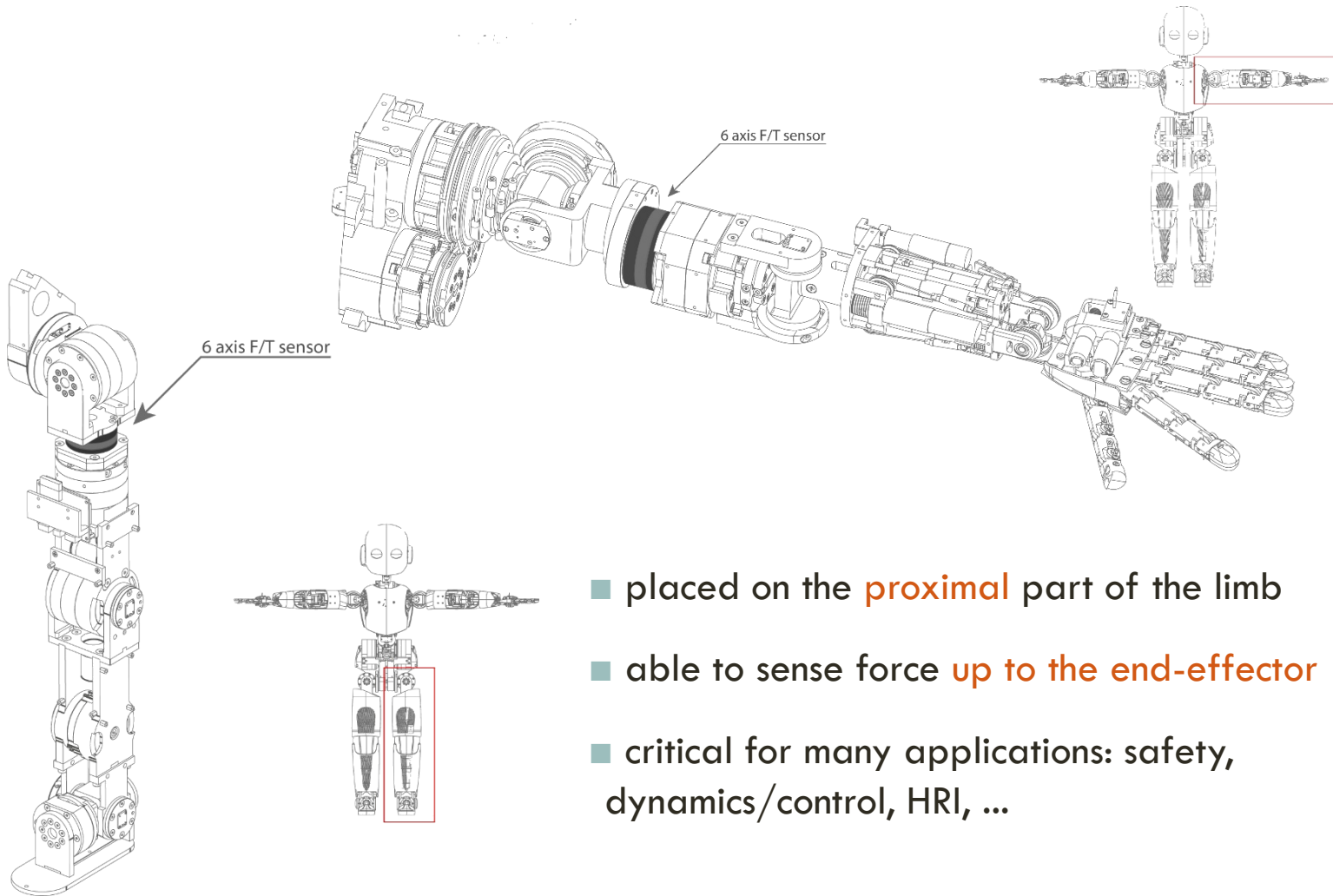
## Software

YARP

Kinematics/Dynamics

Computer Vision & Machine Learning

# HW1 - Force / Torque sensors



- placed on the **proximal** part of the limb
- able to sense force **up to the end-effector**
- critical for many applications: safety, dynamics/control, HRI, ...

# HW1 -Force / Torque sensors - Teaching Actions



# HW2 - Artificial Skin



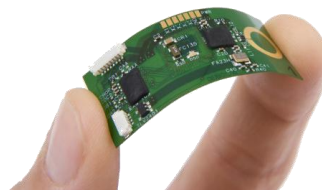
capacitor



- ground plane: conductive fabric

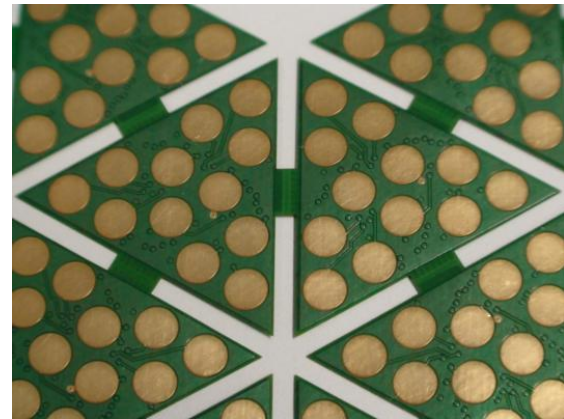
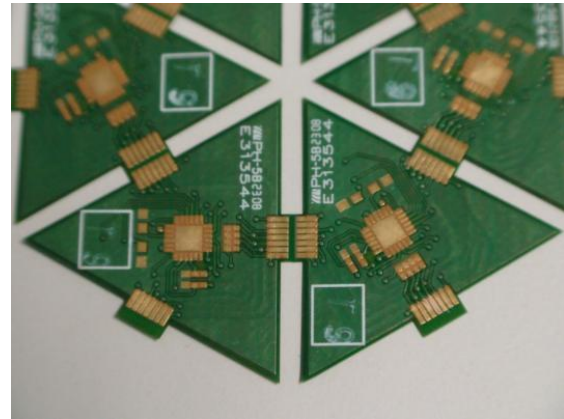
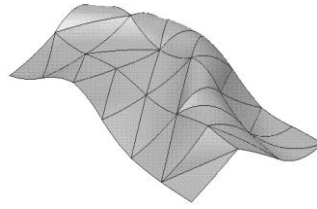
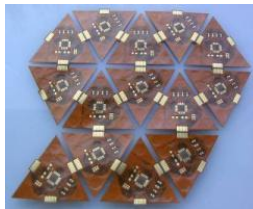
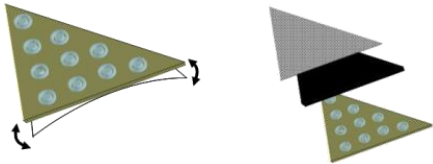
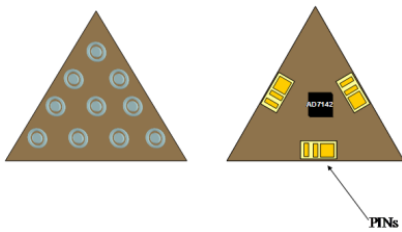


- soft material: e.g. silicone

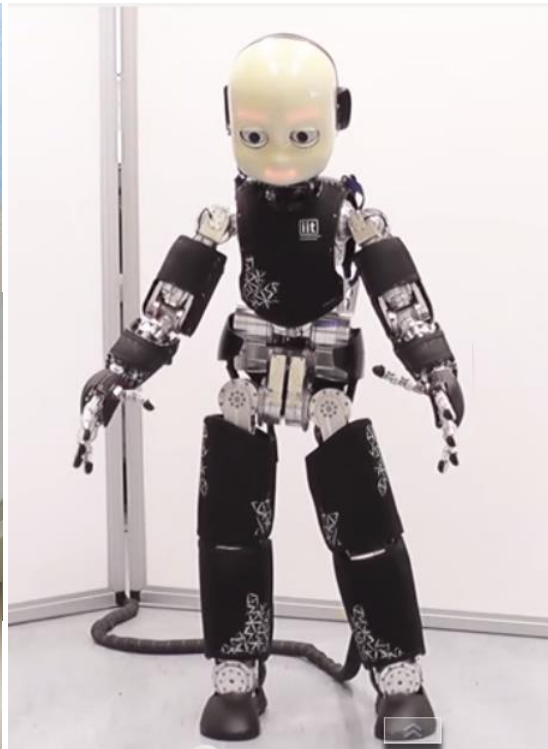


- electrodes: flexible PCB

# HW2 - Artificial Skin



# HW2 - Artificial Skin



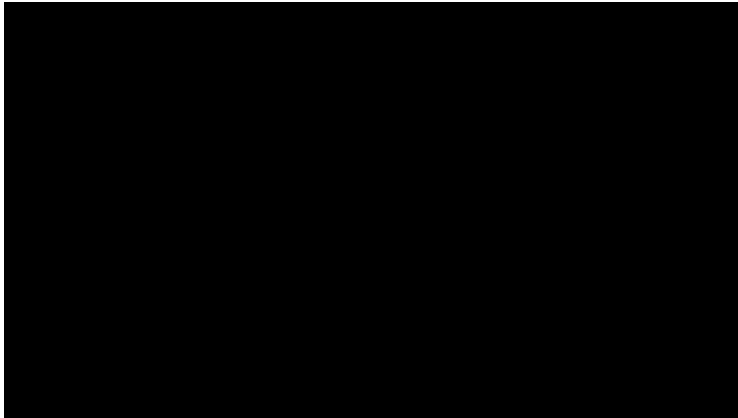
upper body: 1868

legs and feet: 1310x2

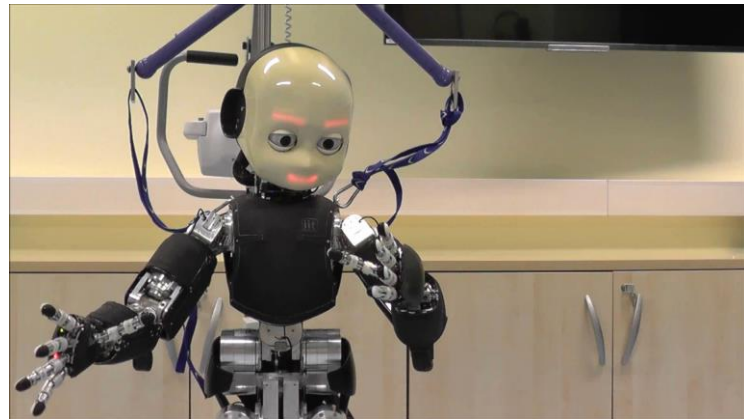


total: 4488 taxels!!

# HW2 - Artificial Skin for grasping



Without tactile feedback



With tactile feedback

# HW2 - Artificial Skin - Self Calibration

## **Automatic kinematic chain calibration using artificial skin: self-touch in the iCub humanoid robot**

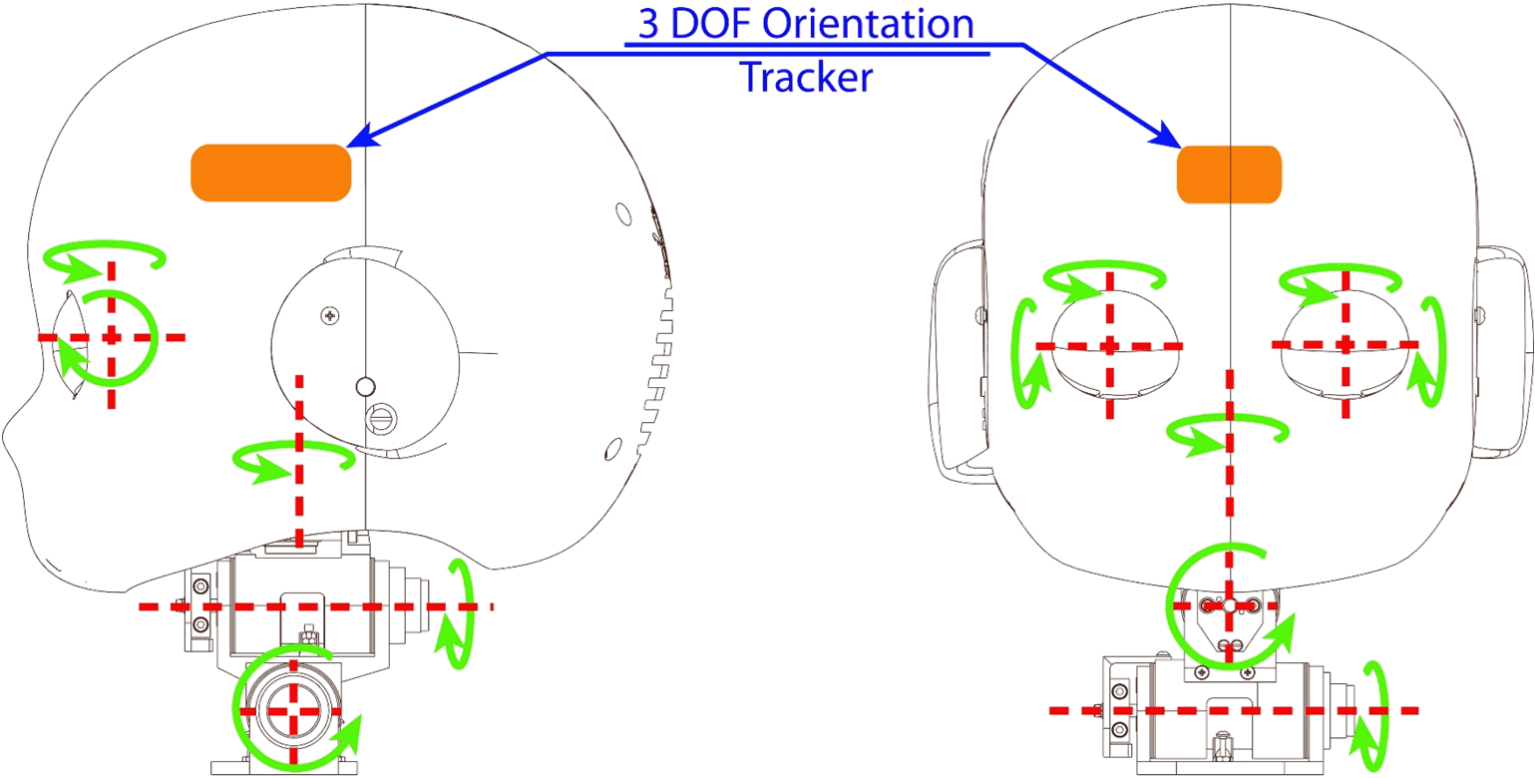
A. Roncone, M. Hoffmann,  
U. Pattacini, and G. Metta



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# HW3 - Inertial Sensor



# HW3 - Inertial Sensor - Gaze Stabilization

## **Gaze Stabilization for Humanoid Robots: a Comprehensive Framework**

A. Roncone, U. Pattacini,  
G. Metta and L. Natale



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iCUB FACILITY

# Outline

## Hardware

Force/Torque Sensor

Artificial Skin

Inertial Sensor

## Software

YARP

Kinematics & Dynamics

Computer Vision & Machine Learning

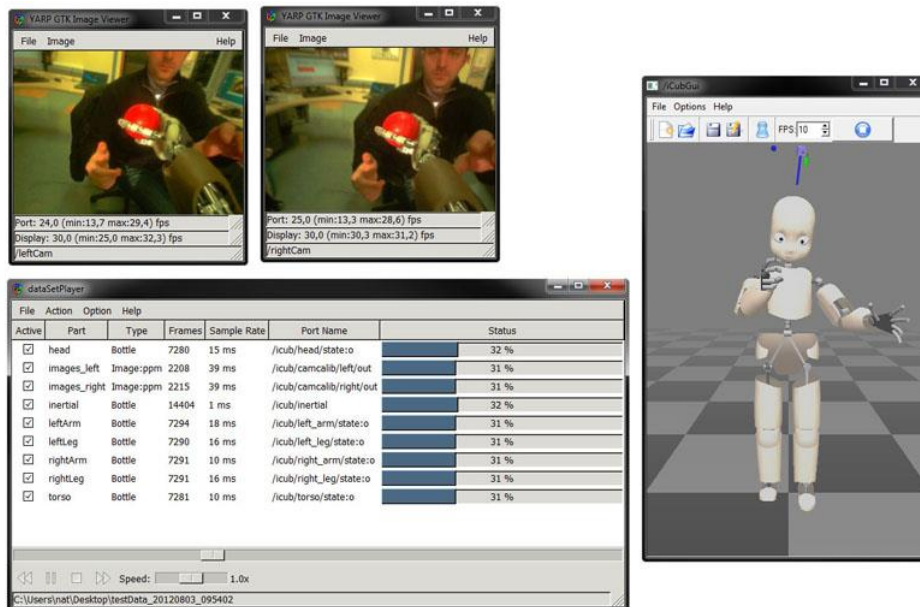
# SW1 - YARP

## YARP → Yet Another Robot Platform

- Peer-to-peer, **loosely coupled**, communication
- Very stable code base **~15 years old** (older than ROS)
- **Flexibility** and **minimal dependencies**, fits well with other systems
- **Easy install** with **binaries on many OSes/distributions** (Ubuntu, Debian, Windows, MacOS)
- Many protocols:
  - Built-in: tcp/udp/mcast
  - Plug-ins: ROS tcp, xml rpc, mjpeg etc..

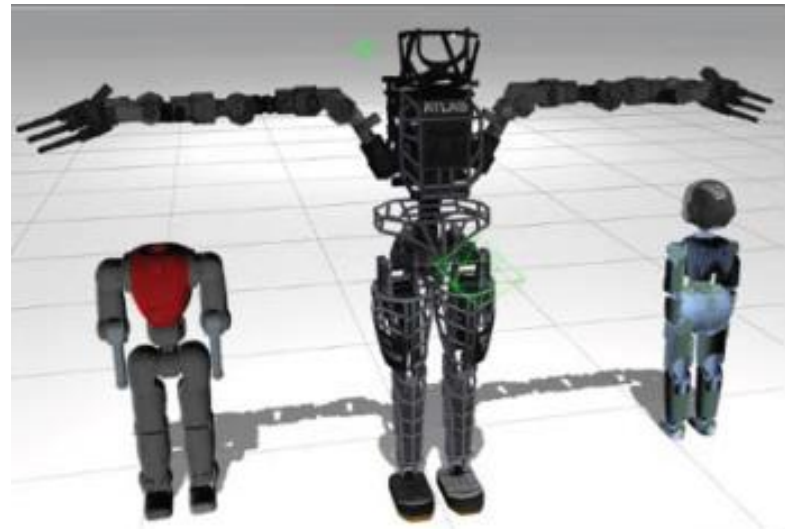
# SW1 - YARP without hardware

- Using YARP without hardware: **dataset player**
- Available in binary releases for Linux and Windows

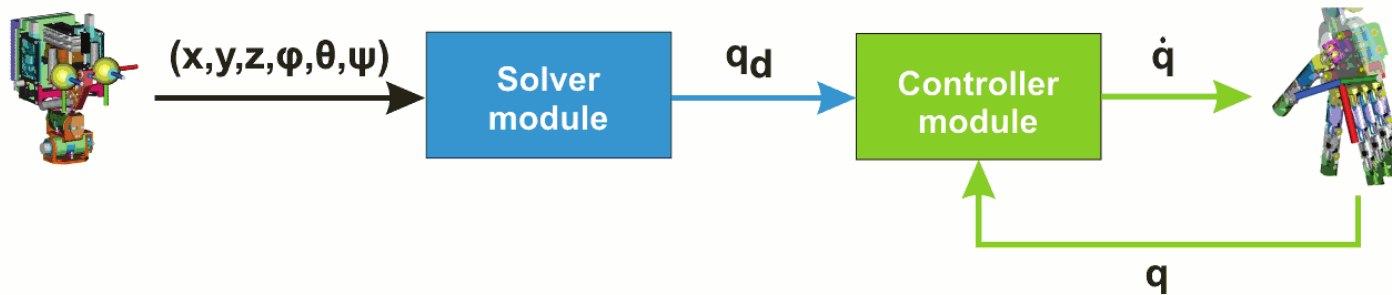


# SW1 - YARP without hardware

- Using YARP without hardware: **simulators**
  - **iCub\_SIM**, and ODE-based simulator
  - **Gazebo**, the VRC/DRC simulator



# SW2 - Inverse Kinematics and Cartesian Control



- Inverse Kinematics Solver + Controller
- IK Solver  $\rightarrow$  Non linear constrained optimization
- Controller  $\rightarrow$  Able to generate smooth, human-like velocity profiles at the end-effector given the desired joint configuration

# SW2 - Inverse Kinematics - IPOPT

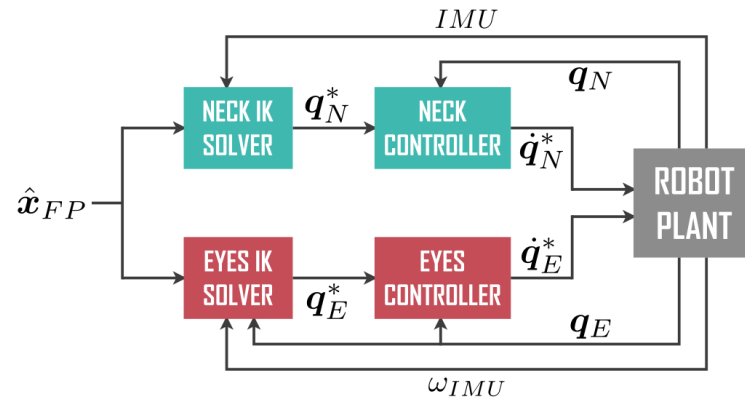
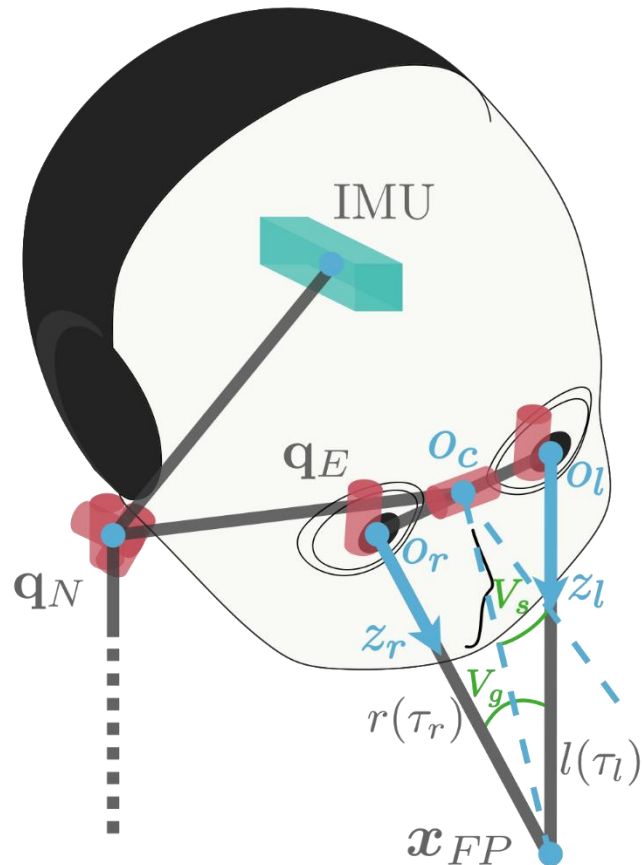
$$\begin{cases} q_d = \operatorname{argmin}_{q \in \mathbb{R}^n} (\| \alpha_d - K_\alpha(q) \|^2 + \beta (q_{res} - q)^T W (q_{res} - q)) \\ s. t. \begin{cases} \| x_d - K_x(q) \|^2 < \varepsilon \\ q_L < q < q_U \end{cases} \end{cases}$$

- Quick convergence (<10ms)
- Scalability
- Singularities and joints bound handling
- Complex constraints:

$$\begin{cases} \min_{\dot{q}, \dot{x}} \frac{1}{2} \left( (\dot{q} - \dot{q}_d)^T W_q (\dot{q} - \dot{q}_d) + (\dot{x} - \dot{x}_d)^T W_x (\dot{x} - \dot{x}_d) \right) \\ s. t. \dot{x} = J \cdot \dot{q} \end{cases}$$

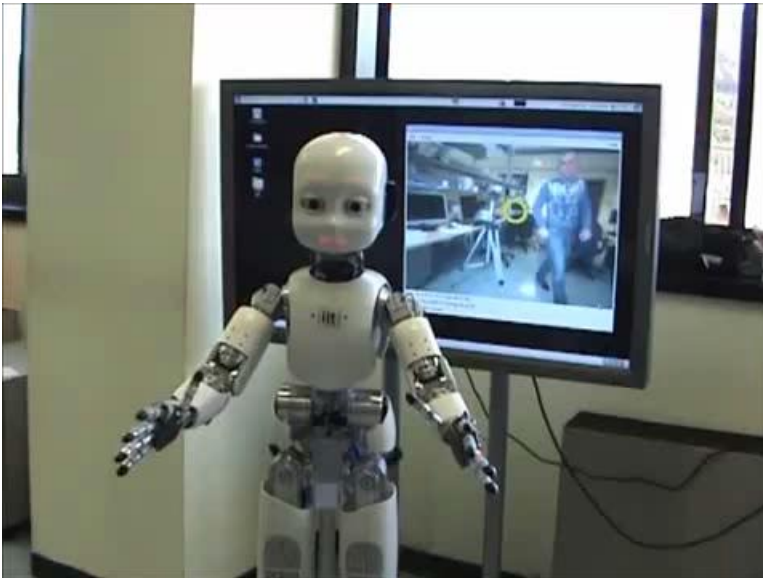


# SW2 - Inverse Kinematics and Gaze Control



- The iCub's head has **6DoF**
- The fixation point can be seen as the end-effector of a virtual kinematic chain that starts from the neck base
- Similar techniques apply

# SW2 - Coordinated Cartesian and Gaze Control



- The red ball is detected thanks to a particle filter tracker
- The tracker provides the 3D position of the ball w.r.t. the robot
- The Cartesian controller steers the arm toward the target 3D point
- The Gaze controller moves the robot's gaze in the same direction
- The Force/Torque sensors make the robot compliant

# SW2 - Dynamics



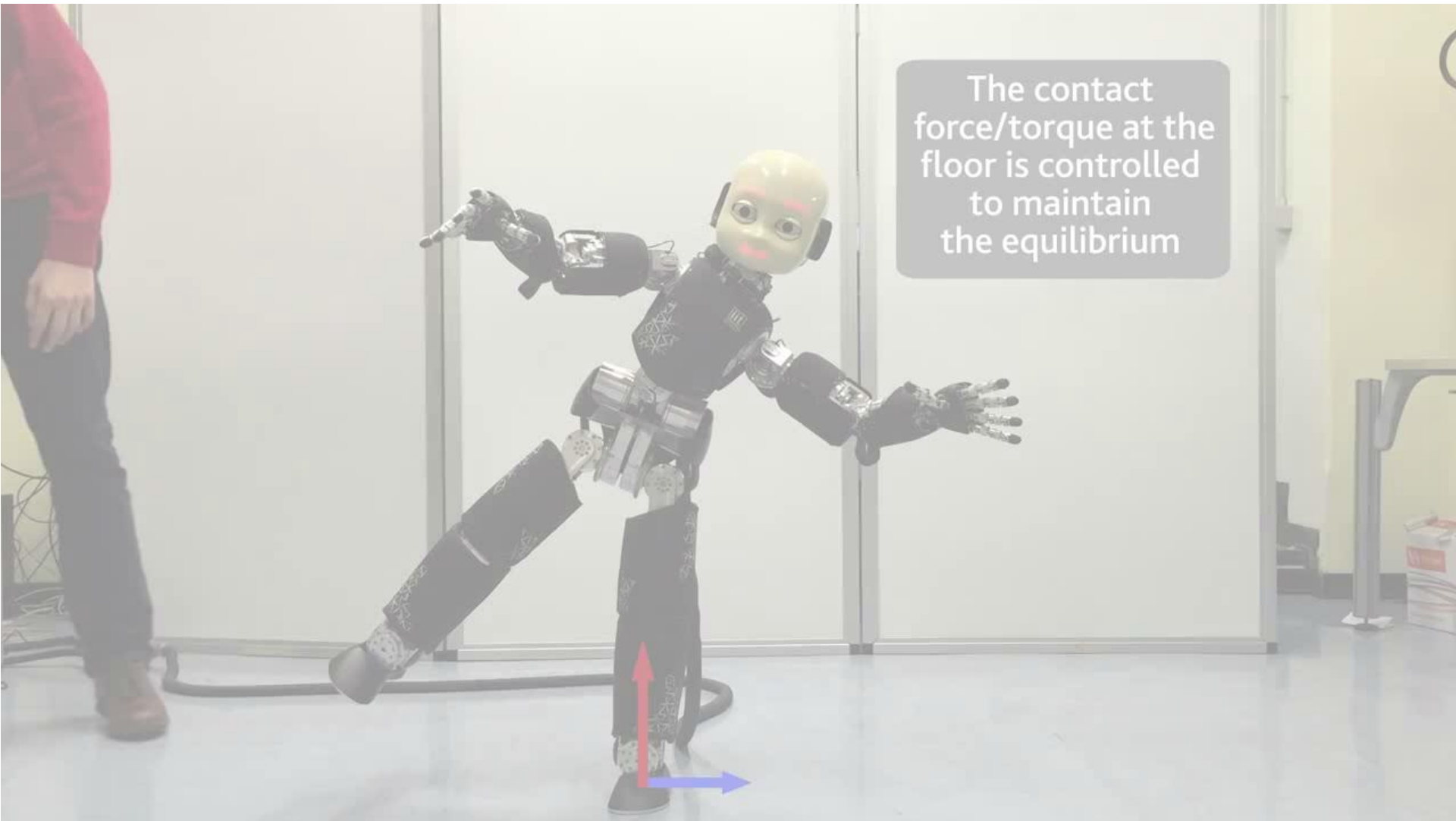
## SW2 - Dynamics is (theoretically) solvable..

$$M(\mathbf{q})\dot{\mathbf{v}}_{\mathbf{q}} + C(\mathbf{q}, \mathbf{v}_{\mathbf{q}})\mathbf{v}_{\mathbf{q}} + \mathbf{g}(\mathbf{q}) = \begin{bmatrix} 0 \\ \tau_{\mathbf{q}} \end{bmatrix} + \mathbf{J}^T(\mathbf{q})\mathbf{f}$$

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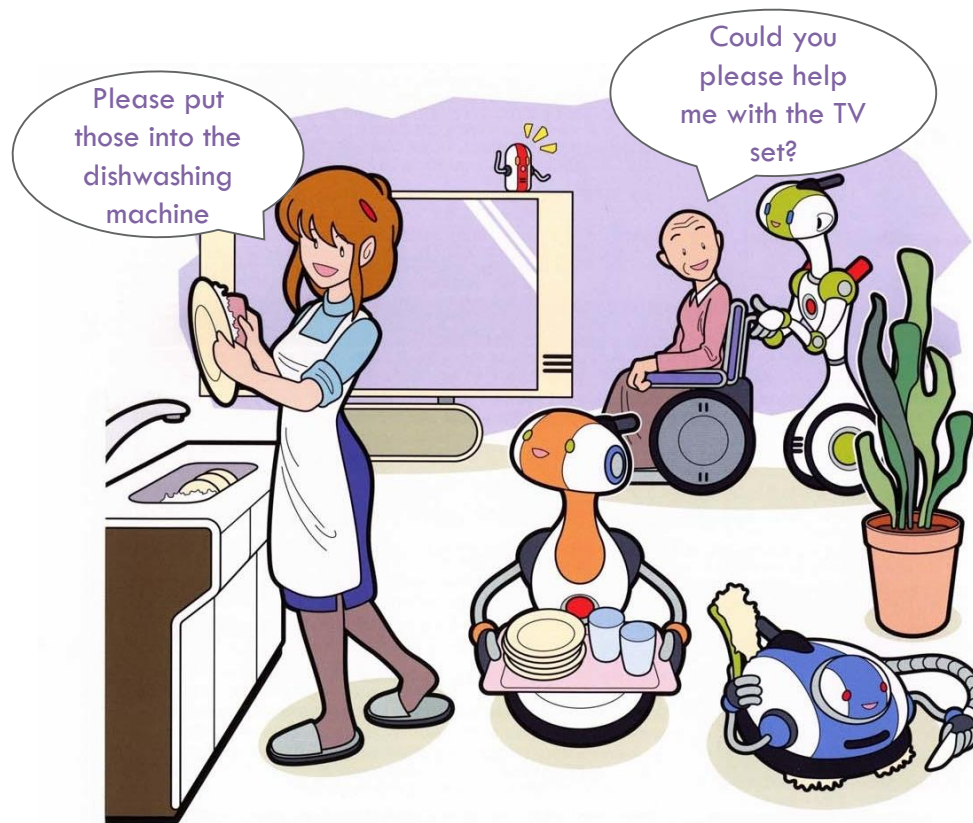
$$[\mathbf{J}(\mathbf{q}) \quad \mathbf{J}(\mathbf{q})] \begin{bmatrix} \dot{\mathbf{v}}_{\mathbf{q}} \\ \dot{\mathbf{v}}_{\mathbf{q}} \end{bmatrix} + \dot{\mathbf{J}}(\mathbf{q}, \mathbf{v}_{\mathbf{q}}) + \dot{\mathbf{J}}(\mathbf{q}, \mathbf{v}_{\mathbf{q}}) = 0$$

..but hard to implement!



The contact force/torque at the floor is controlled to maintain the equilibrium

# SW3 - Computer Vision & Machine Learning



# SW3 - Computer Vision & Machine Learning

The iCub **puts** the **plates** into the **dishwashing machine**

actions      objects      tools

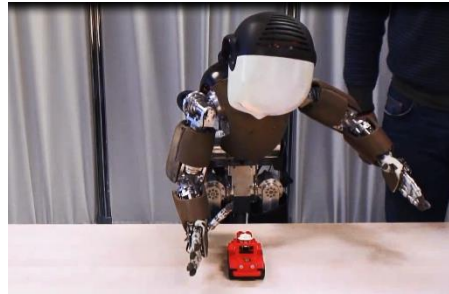
# SW3 - Computer Vision & Machine Learning

Actions



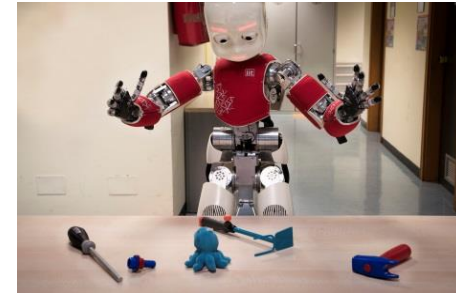
learning actions

Objects



learning objects

Tools

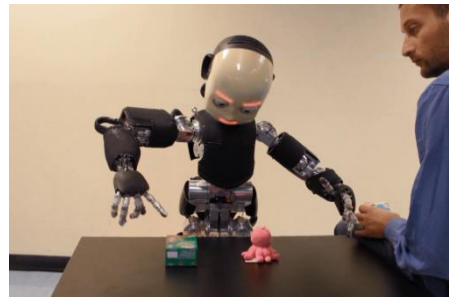


learning tools

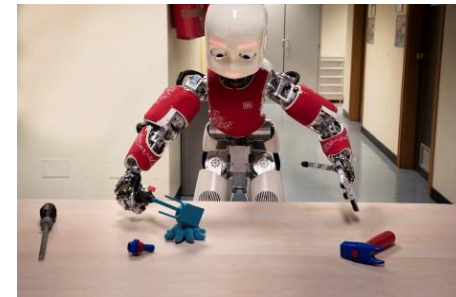
Learn



recognizing actions



recognizing objects



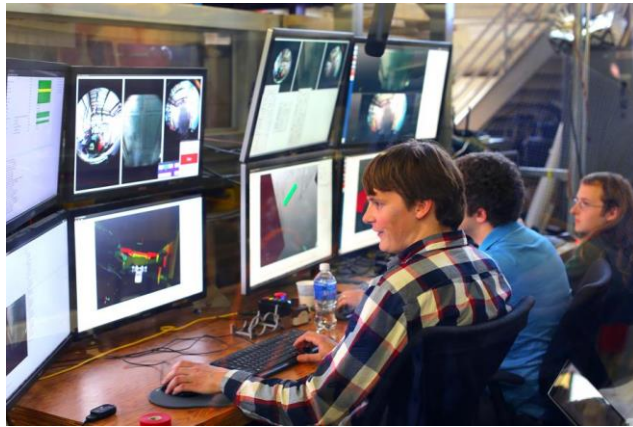
using tools

Use

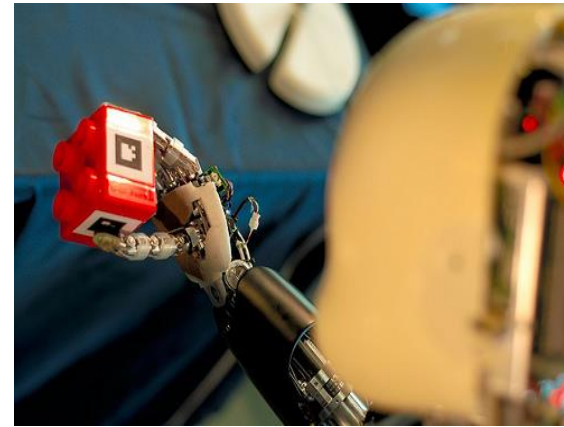


# SW3 - Computer Vision for Robotics

Teleoperation



Markers

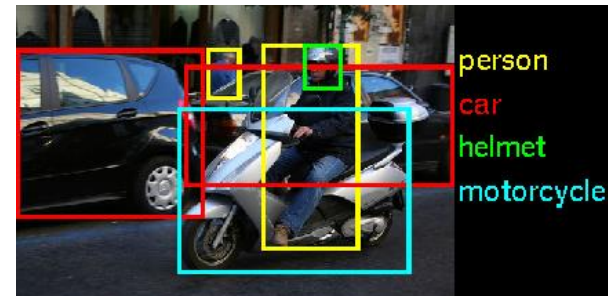


Structured Environment



3D reconstruction & strong supervision

# SW3 - Breakthrough in Computer Vision



Deep Learning

+

Big Datasets

=

Approaching human performance  
on the same dataset!

# There are better ways to do that!

## Human-Robot Interaction

HRI is a natural application for visual recognition

In robotics strong cues are often available, therefore object detectors can be avoided

Recognition as tool for complex tasks: grasp, manipulation, affordances, pose

## Self-Supervision

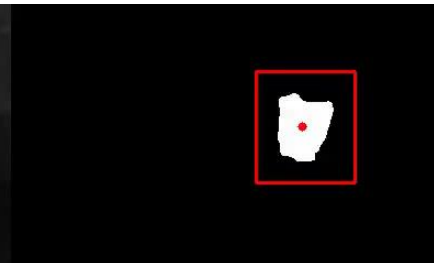
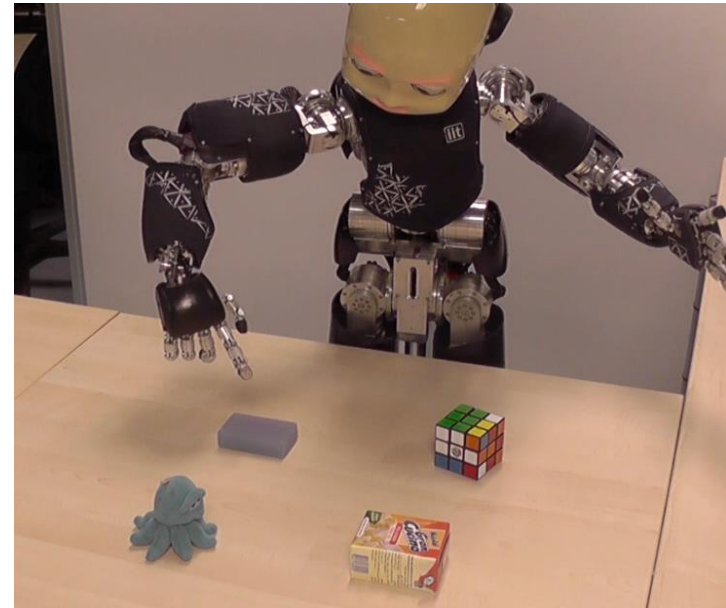
kinematics



motion



# Semi-autonomous Learning

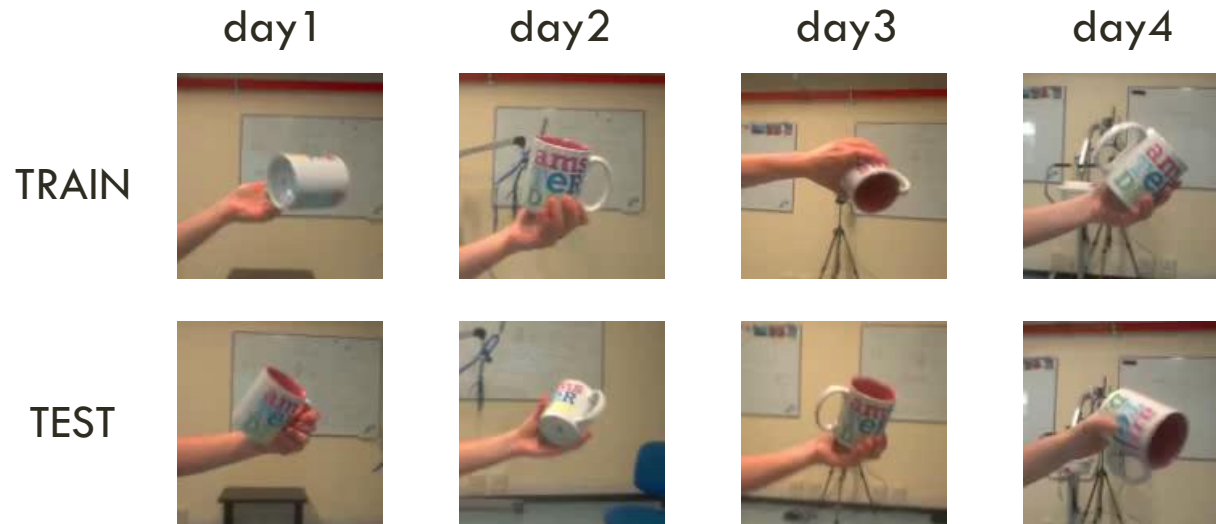


# iCub World 2.0 Dataset



- Growing dataset collecting images from a real robotic setting
- Tool for benchmarking visual recognition systems in robotics
- 28 Objects, 7 categories, 4 different acquisition sessions → ~50K Images
- <http://www.iit.it/en/projects/data-sets.html>

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# Interactive Objects Learning



Thank you! And thanks to:

Giorgio Metta

Lorenzo Natale, Francesco Nori

Ugo Pattacini, Vadim Tikhanoff, Marco Randazzo, Carlo Ciliberto,  
Daniele Pucci, Francesco Romano, Giulia Pasquale, Sean Ryan Fanello,  
Ali Paikan, Jorhabib Eljaik, Silvio Traversaro

The iCub Facility