

# Recent Advances in physical Human-Robot Interaction

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**SAPIENZA**  
UNIVERSITÀ DI ROMA



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# Motivation

Human-friendly robotics



traditional  
robotics



replacing  
humans



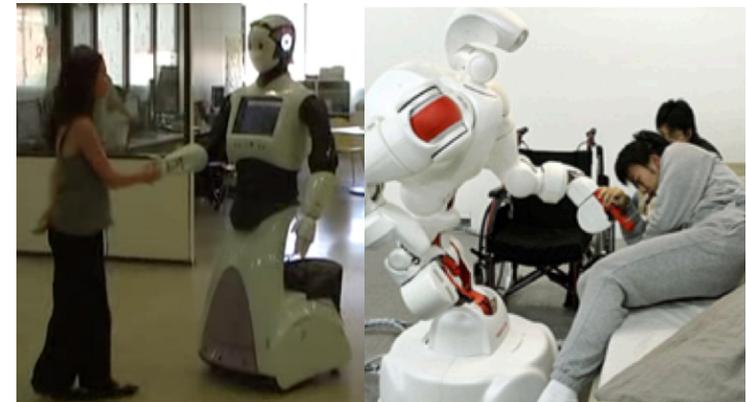
human-  
friendly  
robotics



collaborating  
with humans



co-workers on factory floor



personal robots in service

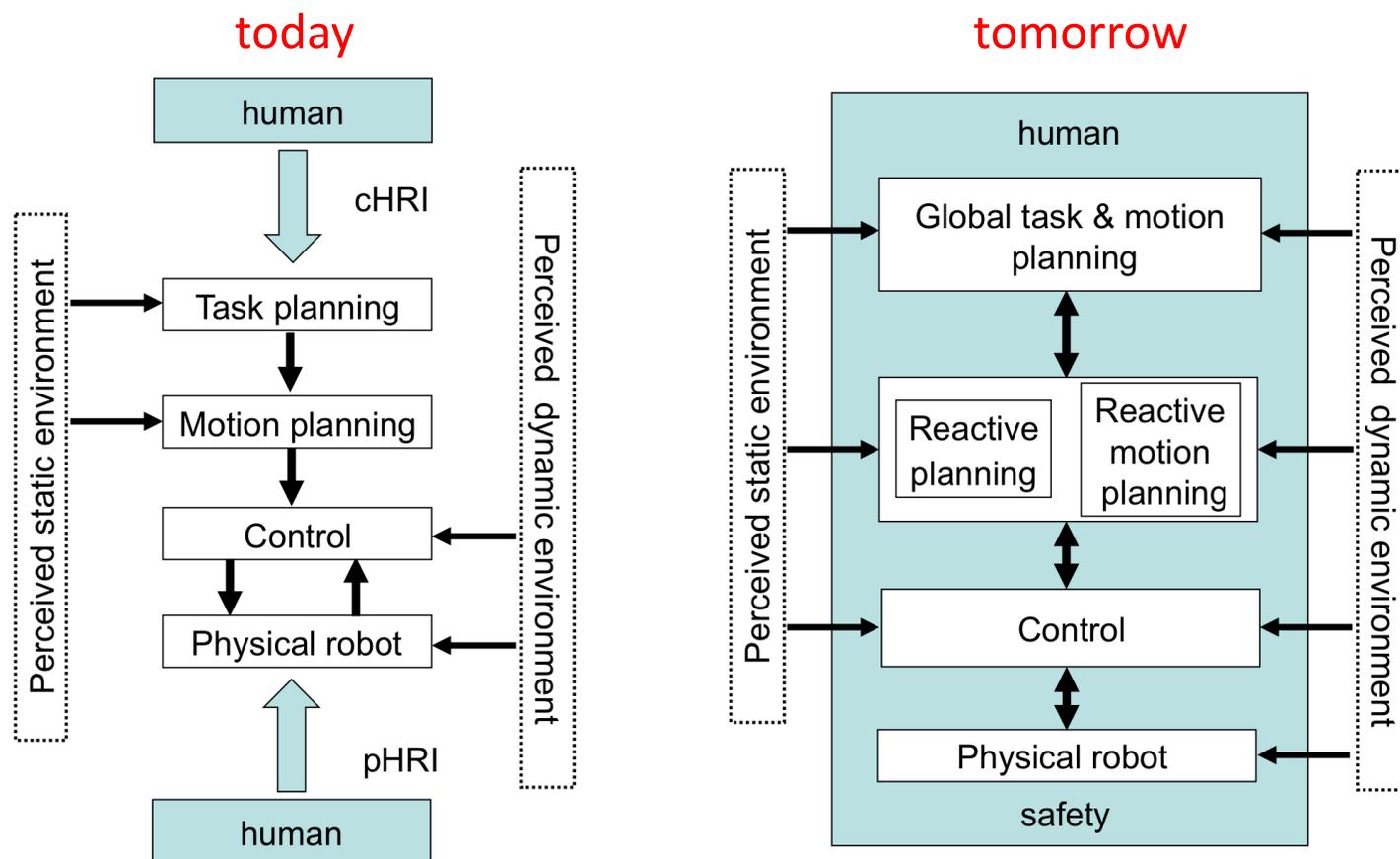


# Human-Robot Interaction

Need of revisiting robot control architectures



- **cognitive HRI**: bi-directional multi-modal communication and understanding
- **physical HRI**: exchange of contact forces, coordinated operation





# Safe physical Human-Robot Interaction

Hierarchy of consistent robot behaviors



- **integrated design and use** of mechanics, actuation, (proprio- and exteroceptive) sensing, communication, and control components



# Physical HRI

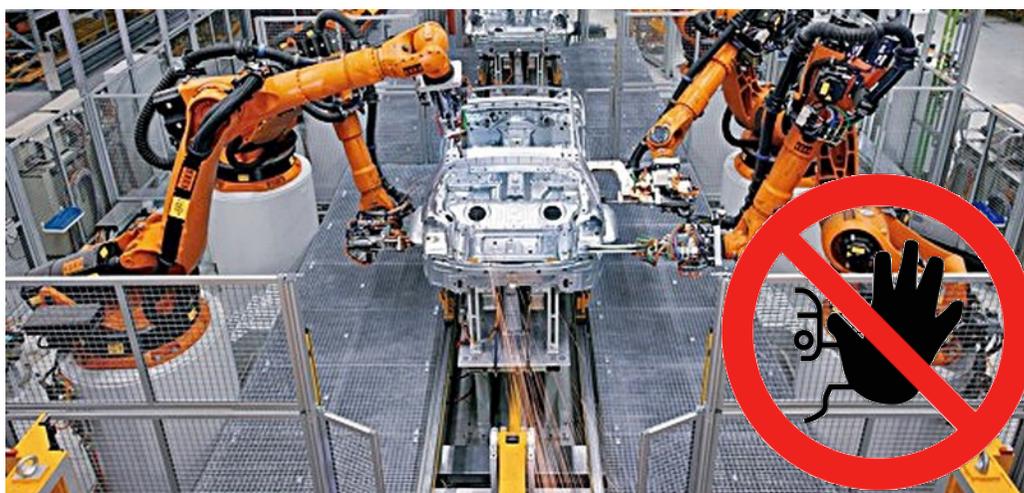
Hierarchy of consistent behaviors



## Safety

**Safety** is the most important feature of a robot that has to work close to human beings

Classical solutions for preserving safety in industrial environments, i.e., using cages or stopping the robot in the presence of humans [ISO 10218], are inappropriate for pHRI





# Physical HRI

Hierarchy of consistent behaviors



**Coexistence** is the robot capability of sharing the workspace with other entities, most relevant with humans

Human (and robot!) safety requirements must be consistently guaranteed (i.e., **safe coexistence**)



original robot task

safe HR coexistence

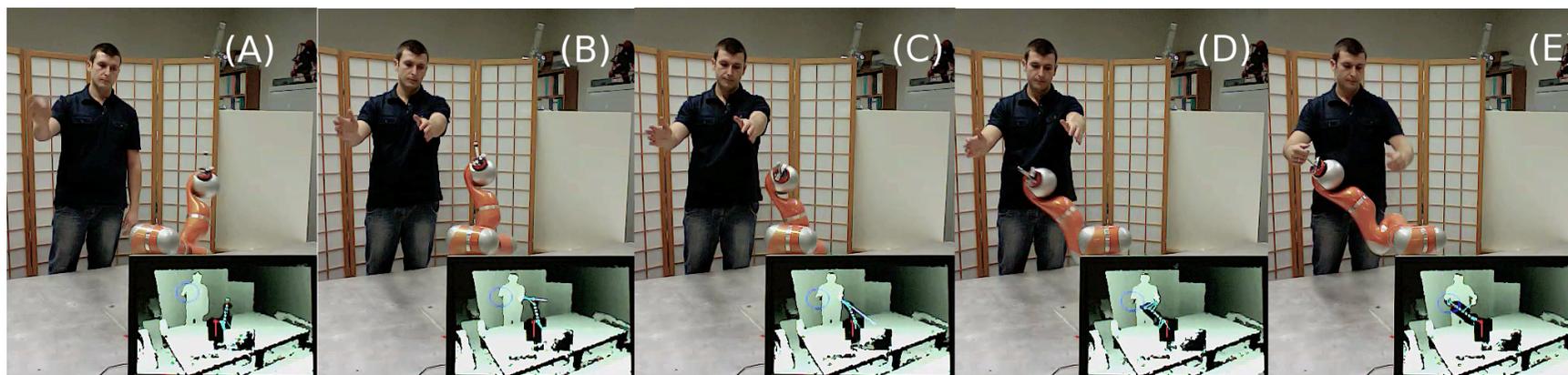


# Physical HRI

Hierarchy of consistent behaviors



**Collaboration** occurs when the robot performs complex tasks with direct human interaction and coordination, in two modalities that are not mutually exclusive (contactless and physical)



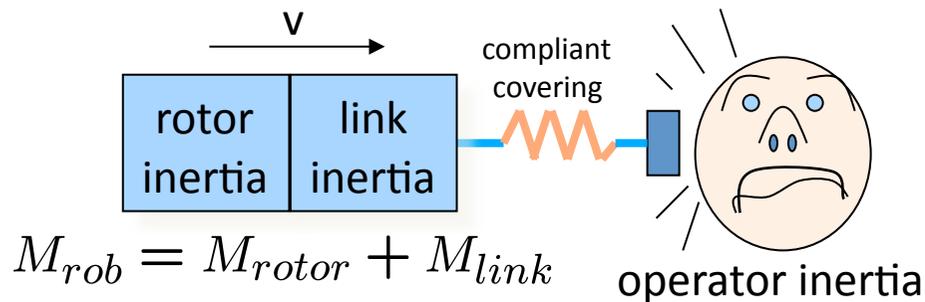


# Mechanics and Safety

A single-dof analysis: **rigid** joint (courtesy of A. Bicchi, Univ. Pisa)

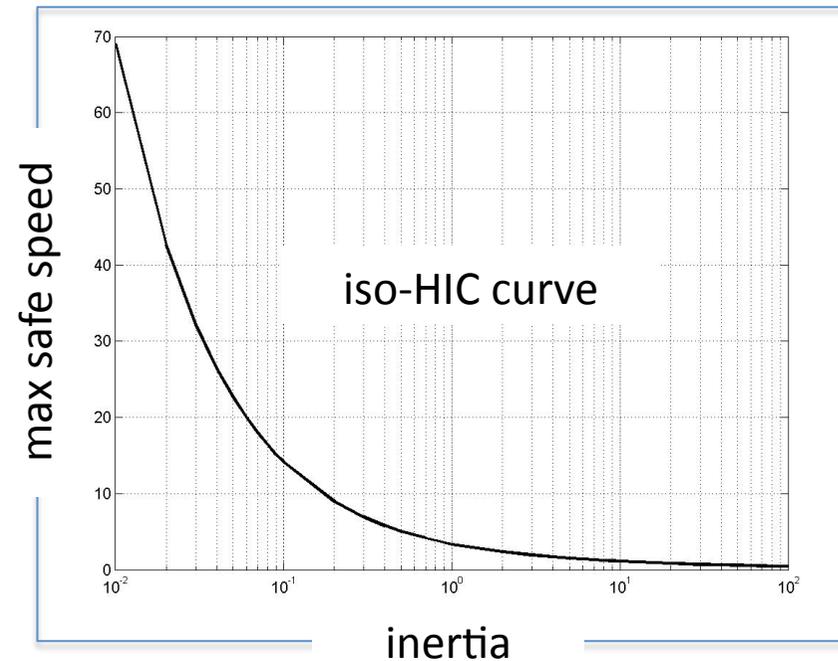


- “soft” robots or “soft” robot behavior is expected to reduce potential injuries due to unforeseen collisions with humans sharing the same workspace
- can we quantify this intuition?



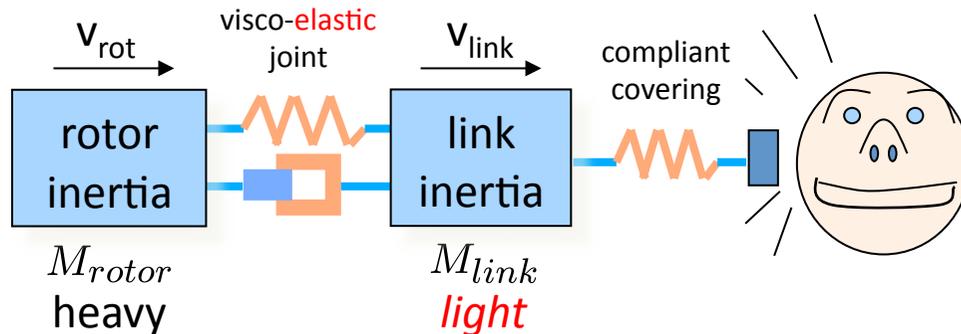
- HIC = Head Injury Criterion (used in automotive industry)

$$HIC = \frac{2^{\frac{5}{2}} M_{rob}^{\frac{7}{4}} K_{cov}^{\frac{3}{4}}}{\pi^{\frac{3}{2}} M_{ope}^{\frac{3}{4}} (M_{rob} + M_{ope})^{\frac{7}{4}}} |v|^{\frac{5}{2}}$$



$$|v|_{max} = \beta(M_{ope}, M_{rob}, K_{cov}) HIC_{max}^{\frac{2}{5}}$$

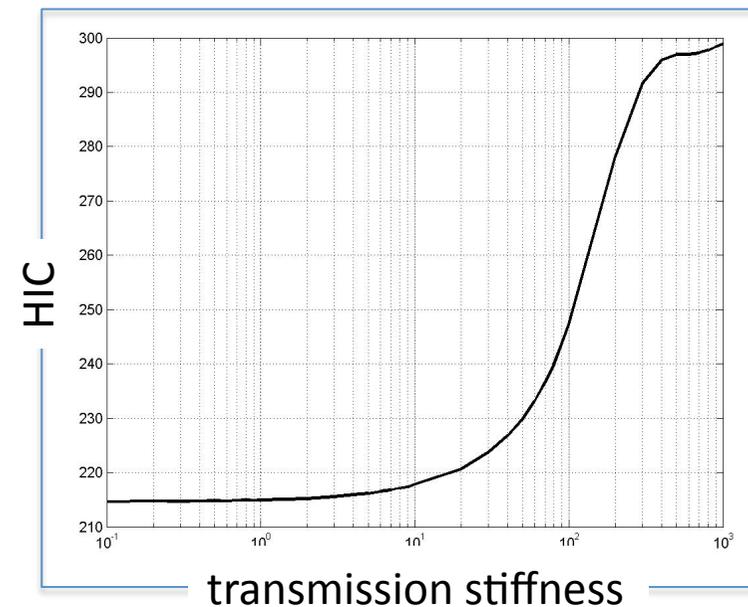
- active force feedback from contact sensor is not enough to increase operating speed with rigid joint and safety constraint (limited control/sampling bandwidth)
- basic idea:** decouple rotor from link inertia via passive compliant transmission (**elastic joint**) and reduce link inertia (**lightweight manipulator**)



WAM robot  
(Salisbury 1988)

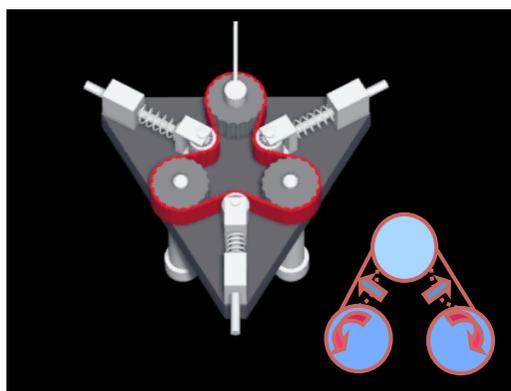
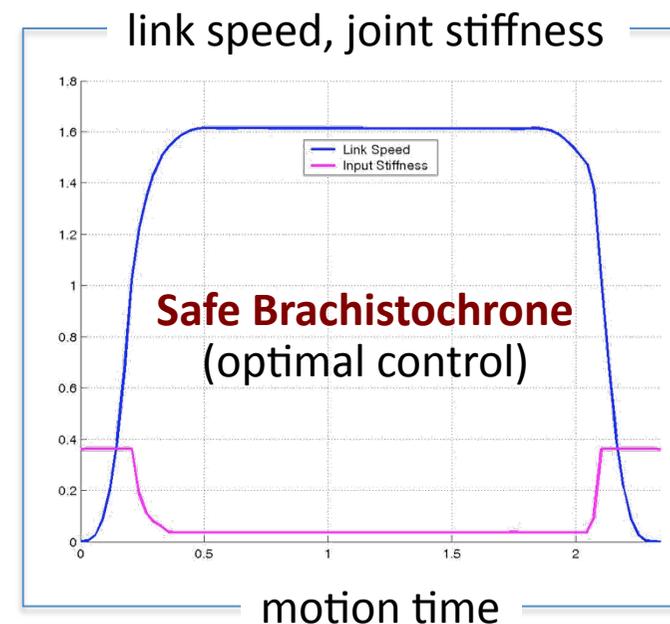
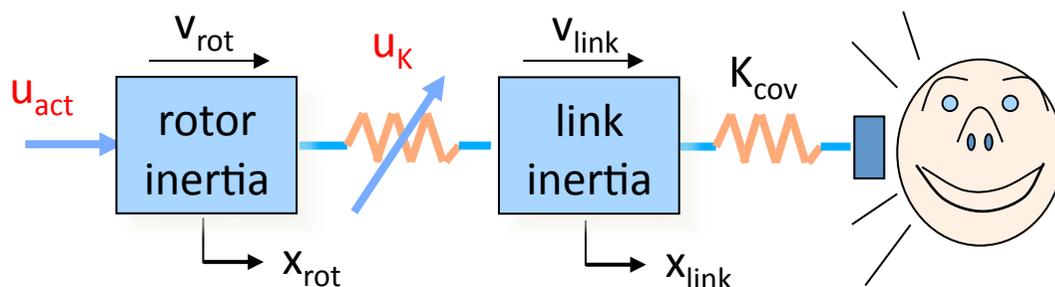


DLR LWR-III  
(Hirzinger 2001)

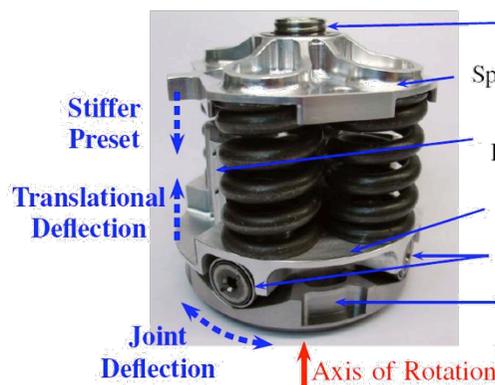


transmissions with joint elasticity:  
**Harmonic Drives**, cables, tendons, ...

- low joint stiffness  $\Rightarrow$  slow response; high stiffness  $\Rightarrow$  high reflected inertia  
limited safe speed under safety constraint (limited control/sampling bandwidth)
- idea: a second motor to **modify on line** the **nonlinear** stiffness of transmissions



UniPisa VSA-I  
antagonistic device (2005)



DLR VSJ  
serial device (2009)

... and, more recently, even many more!

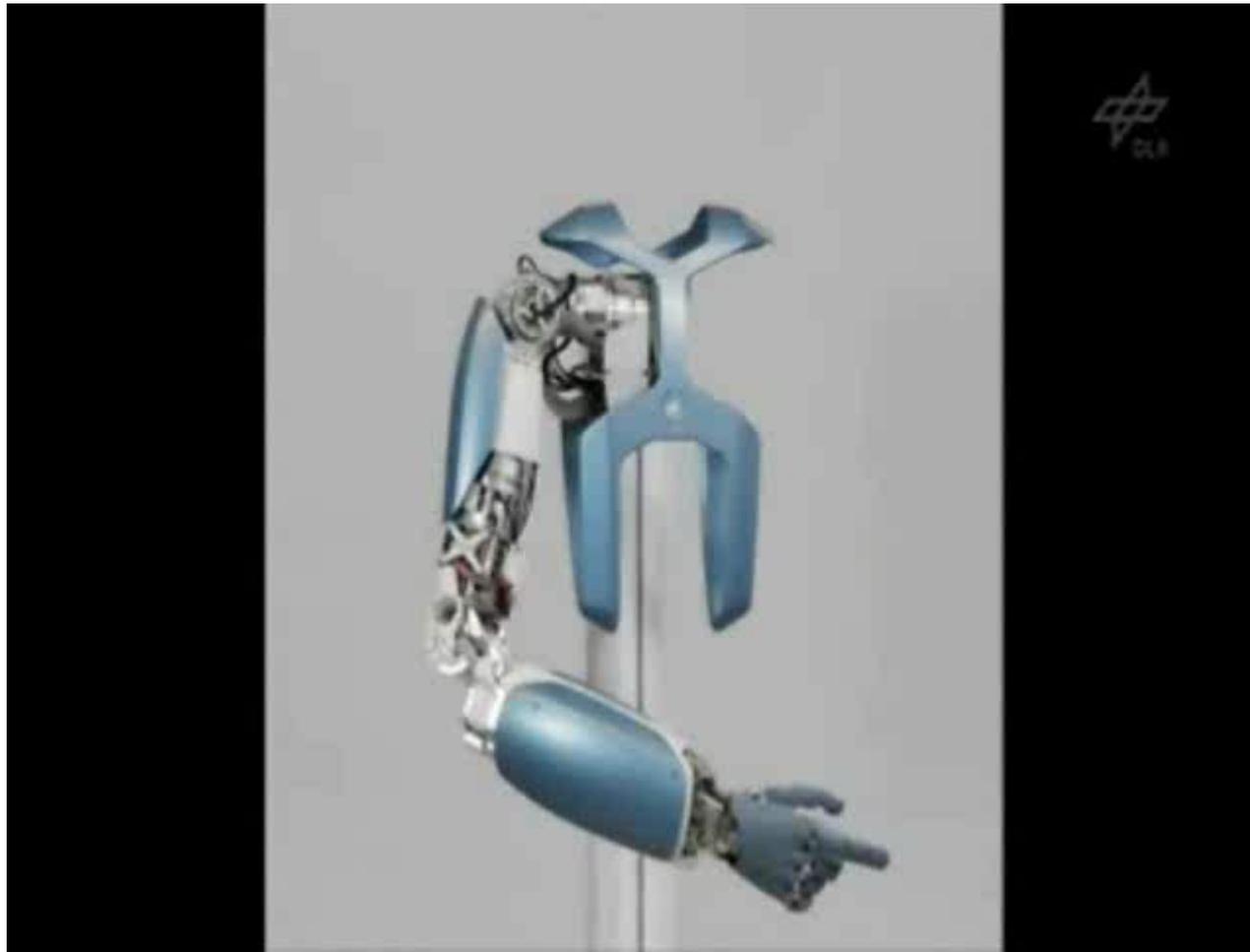


## VSA-based multi-dof robot

DLR hand and upper torso in hammering task



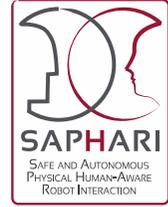
- not only **safety**, but also **efficient use of energy**





# Summarizing

## Mechanical design and control

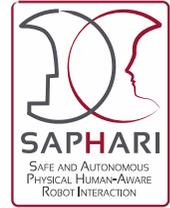


- co-design techniques of **mechanics and control** for safe, yet fast, strong, and accurate robot arms
- use of **constant** or **variable** stiffness joints are viable solutions, complemented by lightweight materials for the robot links
- new paradigm: “design for safety, control for performance”
- **Q:** can all robots with nonlinear flexible transmissions and multi-body dynamics be controlled so as to behave as “rigid” & “independent single-dofs systems”?  
*(at least, during free motion)*
- **YES!** Using **feedback linearization** (nonlinear feedback law, based on measures of the robot state)
- what happens when (intended) contacts or (unexpected) collisions occur?
- can a control design help in keeping a safe behavior? if so, how?



# Safe collision handling

Detection of undesired collisions and robot reaction



- **phases:** pre-impact (avoidance), impact (detection), and post-impact (reaction)
- collision **detection** using **only** on-board robot **proprioceptive** sensors (encoders)
- safe **reaction** (apart from stopping the robot) requires not only “detection” but also “isolation” (which link has collided)
- monitoring of possible collisions should be **always active**
- collisions may occur at **any (unknown) place** along the whole robotic structure
- working assumptions:
  - one single collision at a time
  - manipulator as an open kinematic chain
  - first, rigid joints case  $\Rightarrow$  then, extension to flexible joints

$$M(q)\ddot{q} + C(q, \dot{q})\dot{q} + g(q) = \tau + \tau_K$$

any control torque

joint torque due to link collision

transpose of the **Jacobian** associated to the contact point

$$\tau_K = J_K^T(q)F_K$$

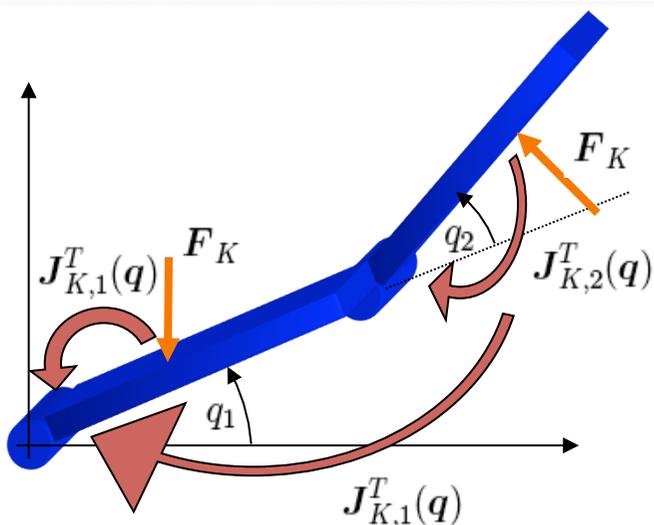
inertia matrix

Coriolis/centrifugal terms



# Collision detection and isolation

Method based on **residual** vector for robots with **rigid** joints



**analysis:** in dynamic conditions, a contact force/torque acting on the  $i$ -th link produces accelerations at ALL joints

**residual** vector monitors the robot generalized momentum  $p = M(q)\dot{q}$

$$\mathbf{r} = \mathbf{K}_I \left( M(\mathbf{q})\dot{\mathbf{q}} - \int_0^t \left( \boldsymbol{\tau} + \mathbf{C}^T(\mathbf{q}, \dot{\mathbf{q}})\dot{\mathbf{q}} - \mathbf{g}(\mathbf{q}) + \mathbf{r} \right) ds \right) \quad \mathbf{K}_I > \mathbf{0} \text{ (diagonal)}$$

each component of  $\mathbf{r}$  is a **decoupled**, **first-order**, **unity-gain** filtered version of the **unknown** external torque

$$\dot{\mathbf{r}} = -\mathbf{K}_I \mathbf{r} + \mathbf{K}_I \boldsymbol{\tau}_K \quad \xrightarrow{\mathbf{K}_I \rightarrow \infty} \quad \mathbf{r} \approx \boldsymbol{\tau}_K \quad \text{detection (over a threshold)}$$

$$\text{collision at link } i \quad \xrightarrow{\quad} \quad \mathbf{r} = \left[ * \quad \dots \quad * \quad * \quad 0 \quad \dots \quad 0 \right]^T \quad \text{isolation}$$

$i+1 \quad \dots \quad N$



# Collision detection and isolation

Extension to robots with **elastic** joints



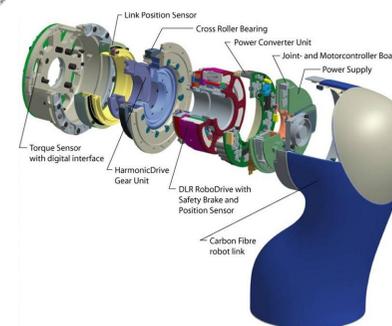
- dynamic model of robots with elastic joints

$$M(q)\ddot{q} + C(q, \dot{q})\dot{q} + g(q) = \tau_J + \tau_K \quad \leftarrow \text{joint torque due to link collision}$$

$$B\ddot{\theta} + \tau_J = \tau \quad \leftarrow \text{motor torques commands}$$

$$\text{elastic torques at the joints} \rightarrow \tau_J = K(\theta - q)$$

- the DLR LWR-III robot has multiple joint sensors
  - encoders for motor ( $\theta$ ) and link ( $q$ ) positions
  - joint torque sensor for  $\tau_J$



$$\tau \rightarrow \tau_J$$

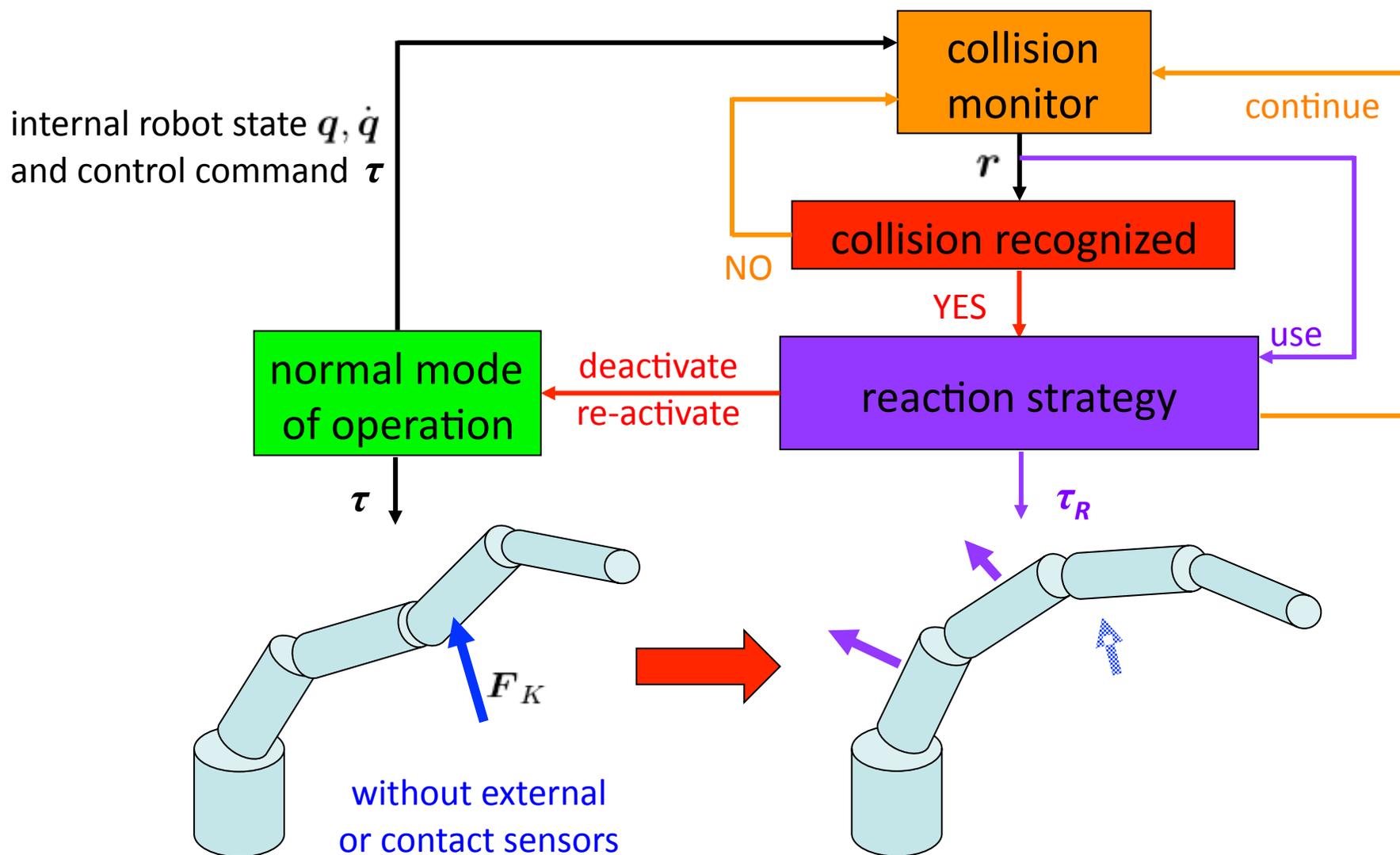
*“replace the commanded torque to the motors with the elastic torque measured at the joints”*

$$r_{EJ}(t) = K_I \left[ p(t) - \int_0^t (\tau_J + C^T(q, \dot{q})\dot{q} - g(q) - r_{EJ}) ds \right]$$



# Collision reaction

Method based on residuals





# Collision detection and reaction

Residual-based experiments on DLR LWR-III



- collision detection followed by different reaction strategies
- detection time: 1-2 ms, reaction time: + 1 ms



admittance mode

reflex torque

reflex torque

first impact at 60°/s

first impact at 90°/s

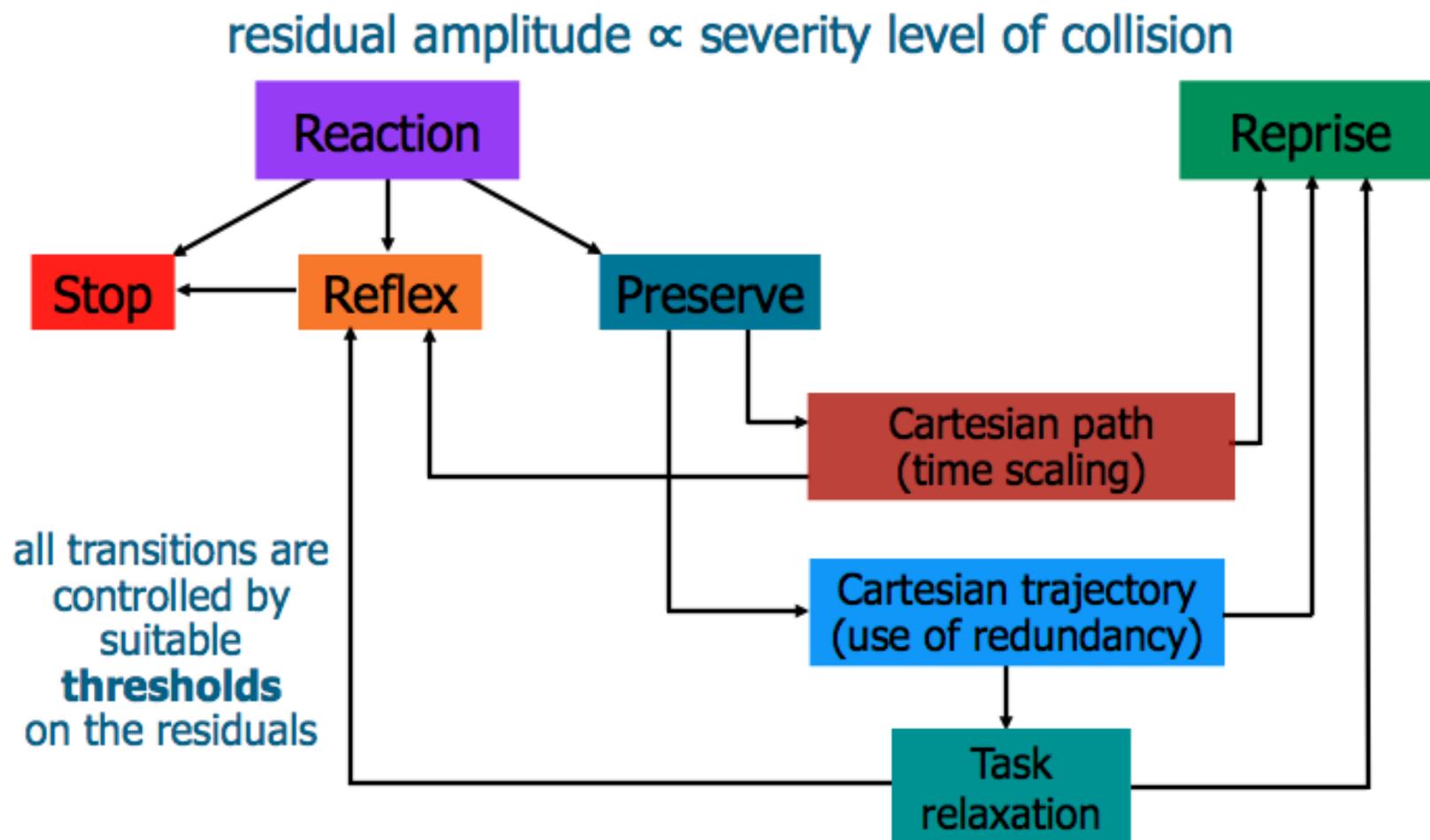
$$\dot{q}_r = \mathbf{K}_Q r$$

$$\tau = \mathbf{M}(q) (\mathbf{K}_R r - \mathbf{D}_R \dot{q}) + \mathbf{C}(q, \dot{q}) \dot{q} + \mathbf{g}(q) - r$$



# Collision reaction

Portfolio of possible robot reactions



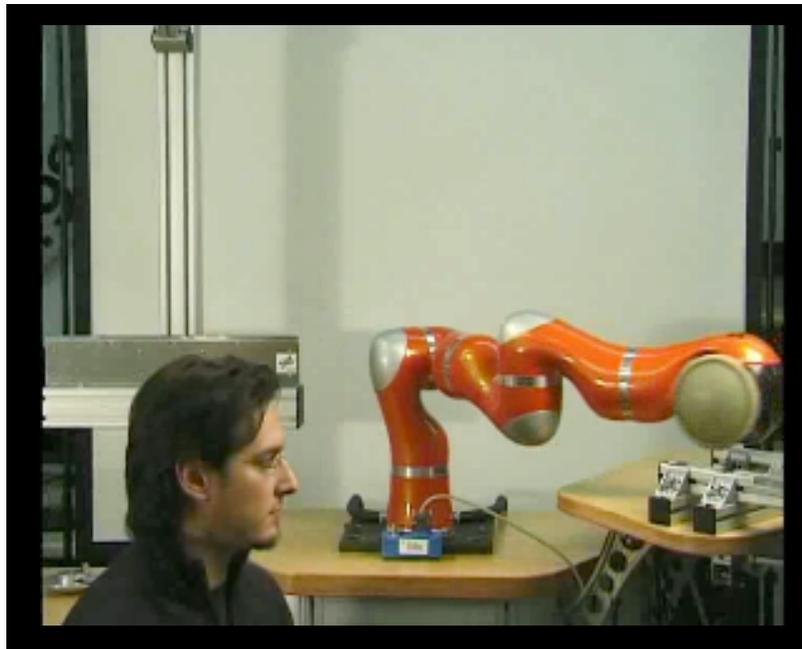


# Collision reaction

## Further examples



- **without** external sensing & **no strict need** of joint torque measurements
- any place, any time ...



results from PHRIENDS project  
(and thanks to DLR volunteer Sami Haddadin!)



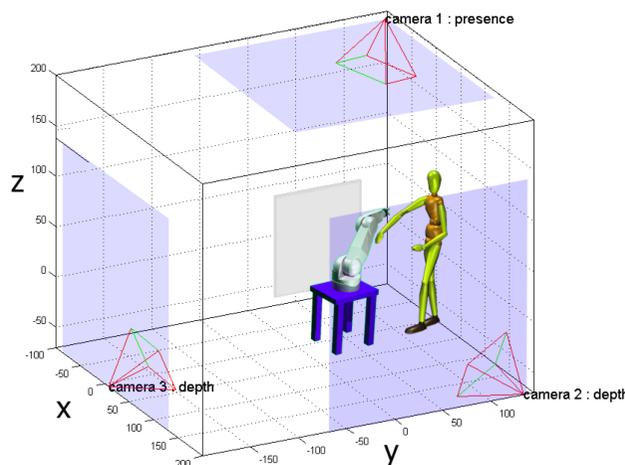
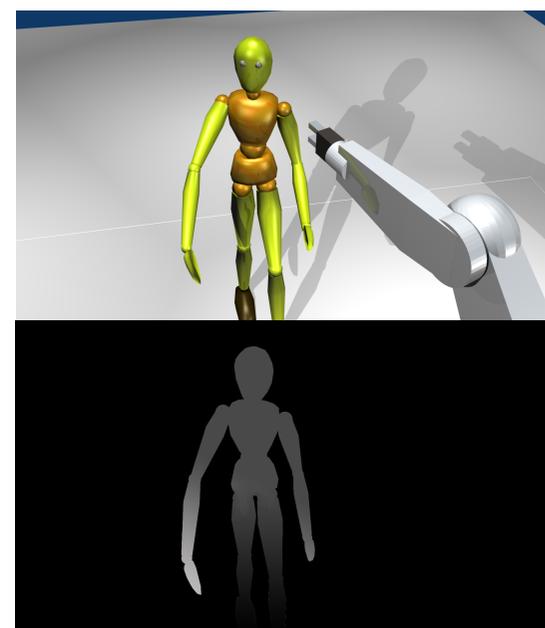
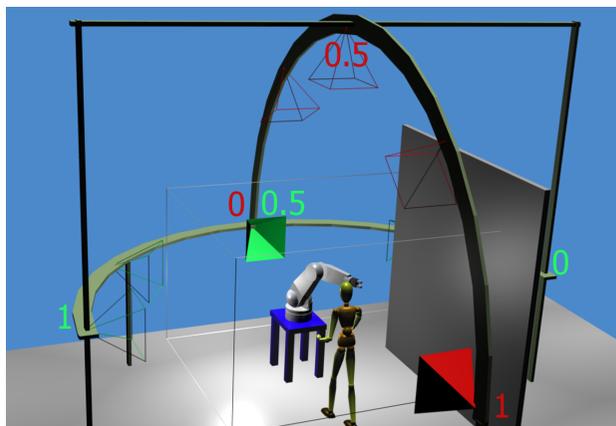


# Collision avoidance

Using exteroceptive sensors to monitor robot workspace



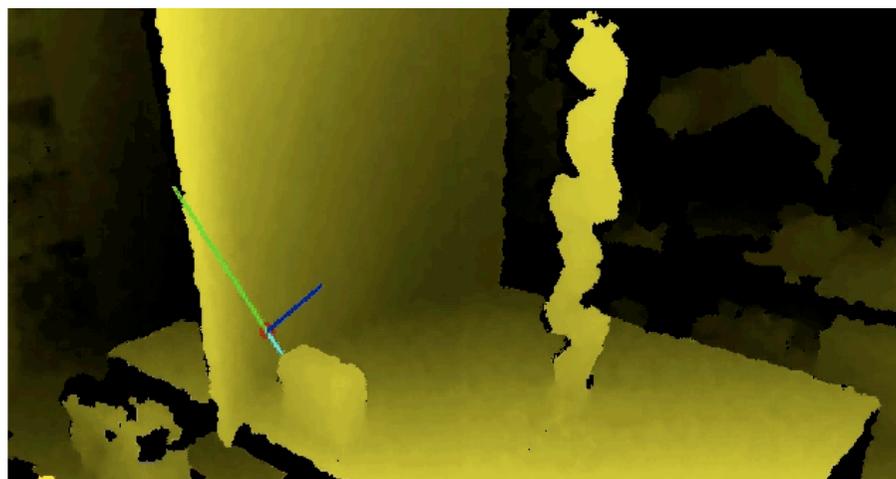
- external sensing: stereo-camera, TOF, structured light, depth, laser, presence, ...  
placed optimally to minimize occlusions (robot can be removed from images)





# Depth image

How to use it?



Configuration Space

Cartesian Space

Depth Space



# Depth space

A 2.5-dimensional space

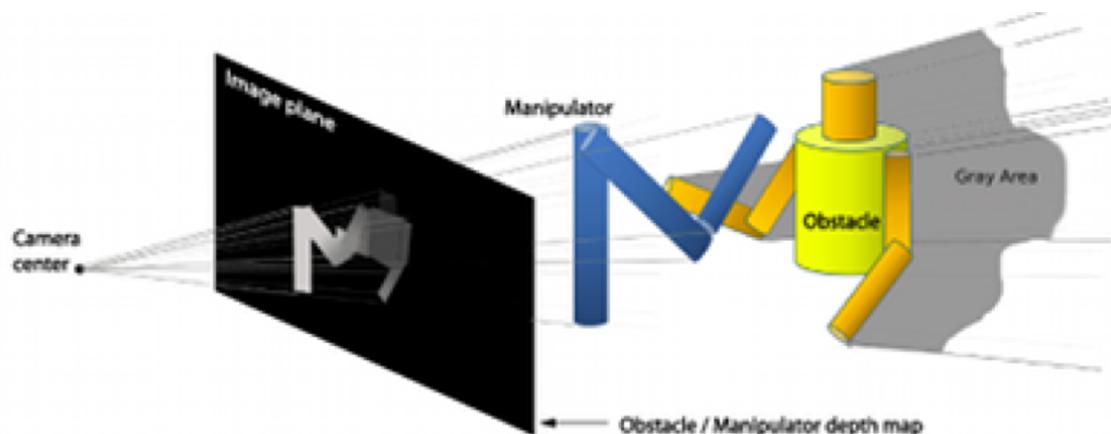


- non-homogeneous 2.5 dimensional space
  - (x,y) position of the point in the image plane [pixel]
  - d depth of the point w.r.t. the image plane [m]
- depth space is modeled as a pin-hole sensor
- point in Cartesian reference frame  $P_R = (x_R, y_R, z_R)$
- point in sensor frame  $P_C = RP_R + t = (x_C, y_C, z_C)$
- point in depth space

$$p_x = \frac{x_C f s_x}{z_C} + c_x$$

$$p_y = \frac{y_C f s_y}{z_C} + c_y$$

$$d_p = z_C$$





# Depth space

## Distance evaluation



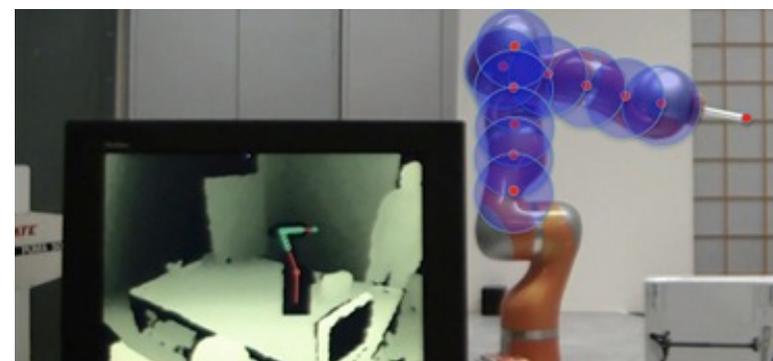
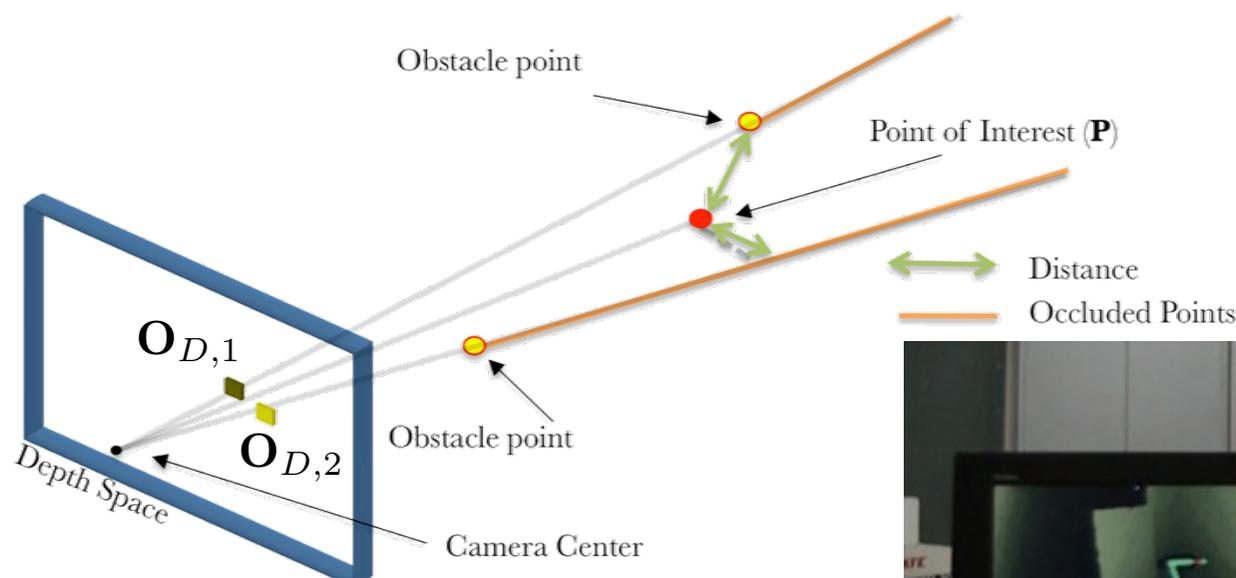
- distance between a **point of interest**  $\mathbf{P}_D = (p_x, p_y, d_p)$  and an **obstacle point**  $\mathbf{O}_D = (o_x, o_y, d_o)$

$$\text{dist}(\mathbf{P}, \mathbf{O}) = \sqrt{v_x^2 + v_y^2 + v_z^2}$$

$$v_x = \frac{(o_x - c_x)d_o - (p_x - c_x)d_p}{fs_x} \quad v_y = \frac{(o_y - c_y)d_o - (p_y - c_y)d_p}{fs_y} \quad v_z = d_o - d_p$$



(if obstacle point is closer than point of interest, set  $d_o = d_p$ )





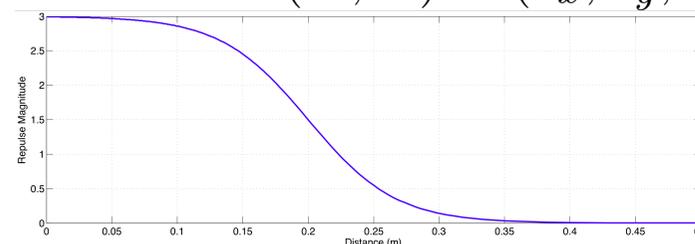
# Repulsive vector

A version of artificial potentials

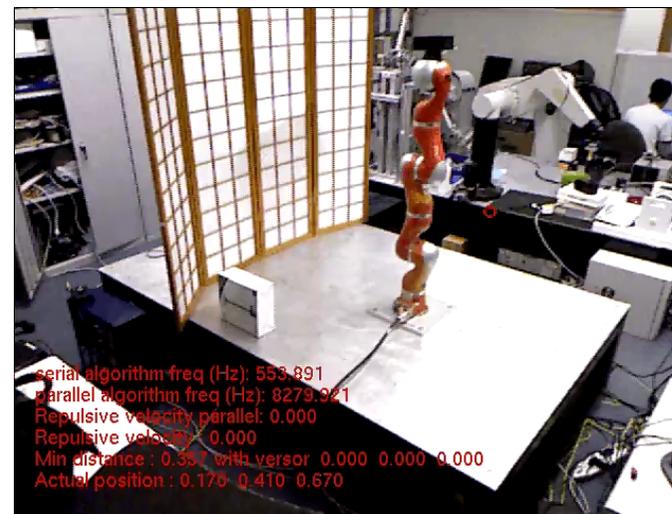
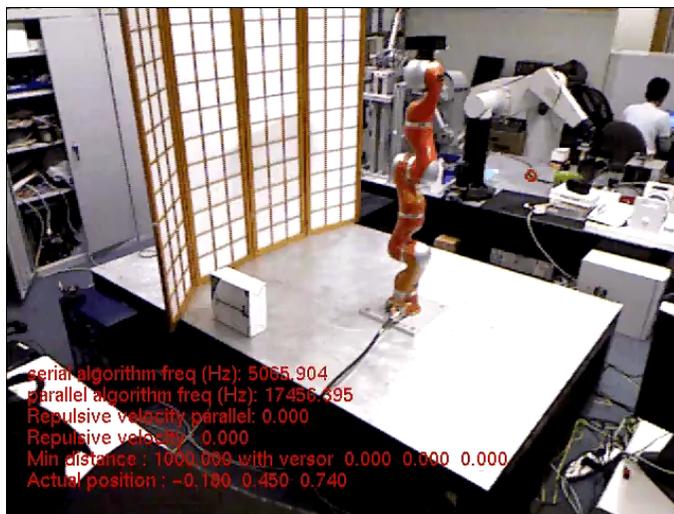


- repulsive vector generated from the distance vector  $D(P, O) = (v_x, v_y, v_z)$

$$v(P, O) = \frac{V_{max}}{1 + e^{\|D(P, O)\| (2/\rho)\alpha - \alpha}}$$



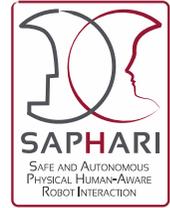
- repulsive vectors due to **all** obstacles near to point of interest are considered
  - orientation  $\Rightarrow$  sum of all repulsive vectors, magnitude  $\Rightarrow$  nearest obstacle
  - inclusion of a **pivoting** strategy to avoid local minima or “too fast” obstacles





## Safe coexistence

Collision avoidance in depth space



**Human and Robot share  
the same workspace...**



# What about using industrial robots?

From DLR LWR-III and KUKA LWR 4 to commercial manipulators



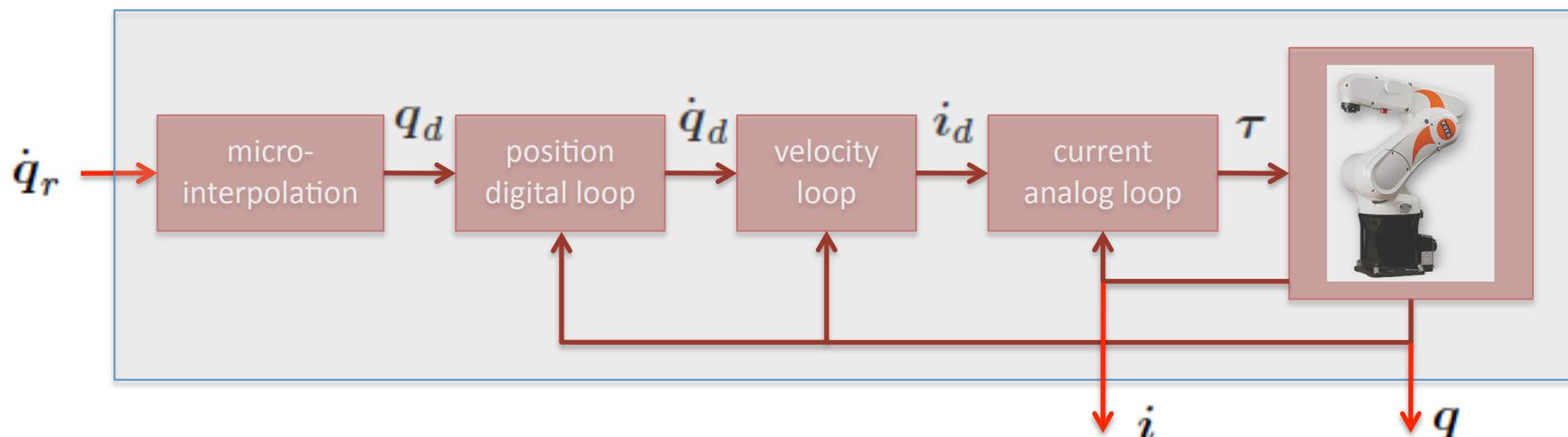
KUKA KR 5 Sixx R650

- 7-dof human-arm size, weight = 14 kg = **payload**
- dynamic model available
- joint torque sensor available
- torque controlled
- Fast Research Interface (FRI) **@1 ms**, with access to motor current commands
- **common aspects**
  - can interface with MS Kinect and integrate Reflexxes Motion Libraries
  - user may develop middleware in ROS (operational nodes)
- 6-dof arm, weight = 28 kg, payload = 3 kg
- **closed** control architecture
- no information on dynamic model and on the industrial low-level controllers
- Robot Sensor Interface (RSI) **@12 ms**, for **reading** encoder positions and motor currents



## Closed control architecture

What can (or could) be done with the RSI



- the external reference velocity can be updated (every 12 ms), based on encoder and motor current readings + external sensor information
  - no torque or current command can be imposed
  - relies on the “good” properties of the low-level (P/PD/PID) KUKA controllers
- a reference velocity could be computed so as to apply a desired torque to the robot (“torque transformer” method by O. Khatib)
  - based on inverting the closed-loop plant
  - needs knowledge of robot dynamics and of low-level control laws & parameters

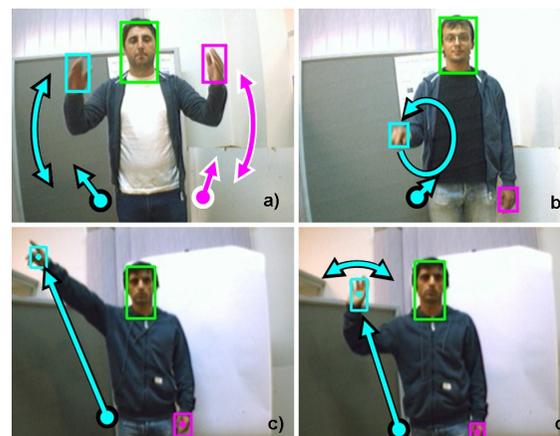
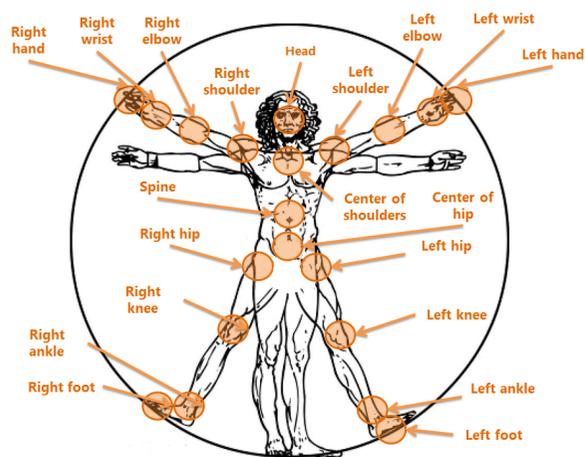


# Contactless collaboration

Using gesture and voice commands



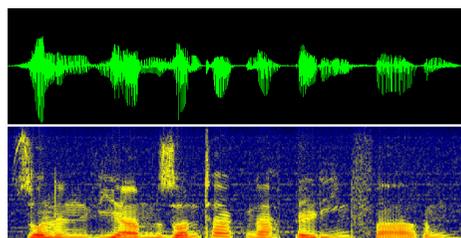
- human body parts and gesture recognition



- speech recognition



Voice command



Collaboration starts



# Human-robot communication

Using MS Kinect and SDK library



- the robot end-effector **position** is commanded by voice/gestures to **follow** (or **go to**) the human **left, right, or nearest hand**





# Human stopping the robot

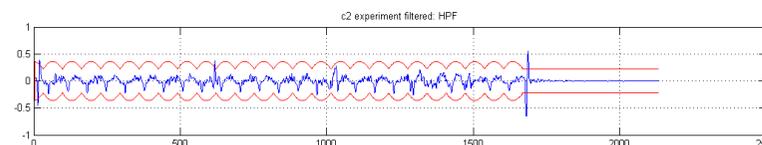
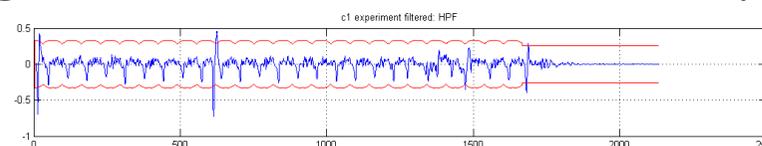
## Signal-based collision detection processing motor currents



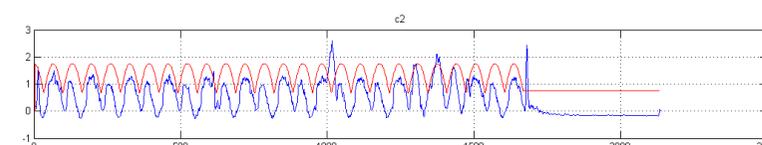
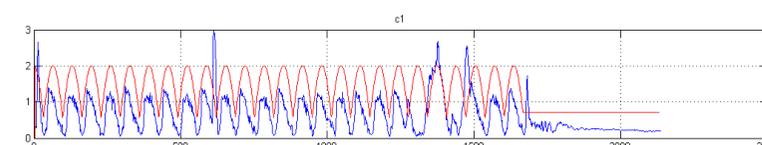
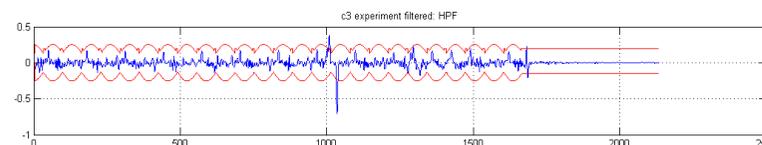
- detection of collisions and temporary stop
  - no force sensing, no dynamic model, closed architecture (here: work with 3 joints only)
  - low-pass (LPF) and high-pass (HPF) filtering of measured motor currents used in parallel



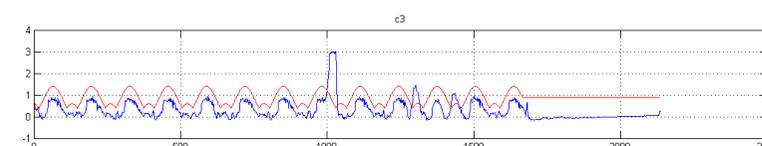
time-varying thresholds depend only on commanded velocity and acceleration



HPF



LPF





## Designing robot reaction strategies

Detect collision & stop / Detect interaction intent, stop, float away upon contacts /  
Imposing a compliant-like behaviour



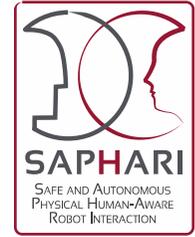
- distinguish undesired collisions (*hard*) from human intention to interact (*soft*), by looking at motor current HPF and LPF alarms (HPF off, LPF on in latter case)



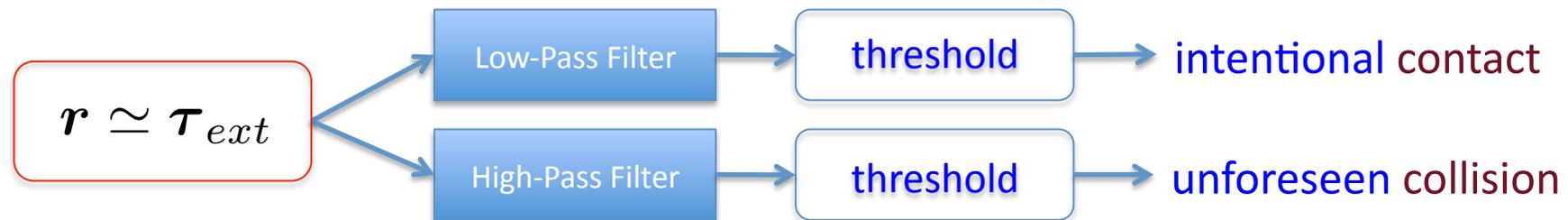


# Contact force estimation

Combining internal and external sensing



similarly to what done for the currents, by processing the residual (external forces) in the frequency domain, it is possible to distinguish



for intentional contacts, Kinect data are used to locate **contact points**

using the Jacobians  $\mathbf{J}_k(\mathbf{q})$  associated to the contact points, **external forces** can be estimated (without the need of force/torque sensors!) as

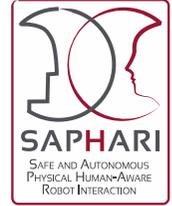
$$\begin{pmatrix} \hat{\mathbf{F}}_1 \\ \hat{\mathbf{F}}_2 \end{pmatrix} = \left( \mathbf{J}_1^T(\mathbf{q}) \quad \mathbf{J}_2^T(\mathbf{q}) \right)^\# \mathbf{r} \quad (k=2)$$

estimates of the external forces can be used for controlling the robot (e.g., by an impedance scheme) at the Cartesian level



## Safe physical collaboration

Robot searching for contact with designated human part (one of the hands)

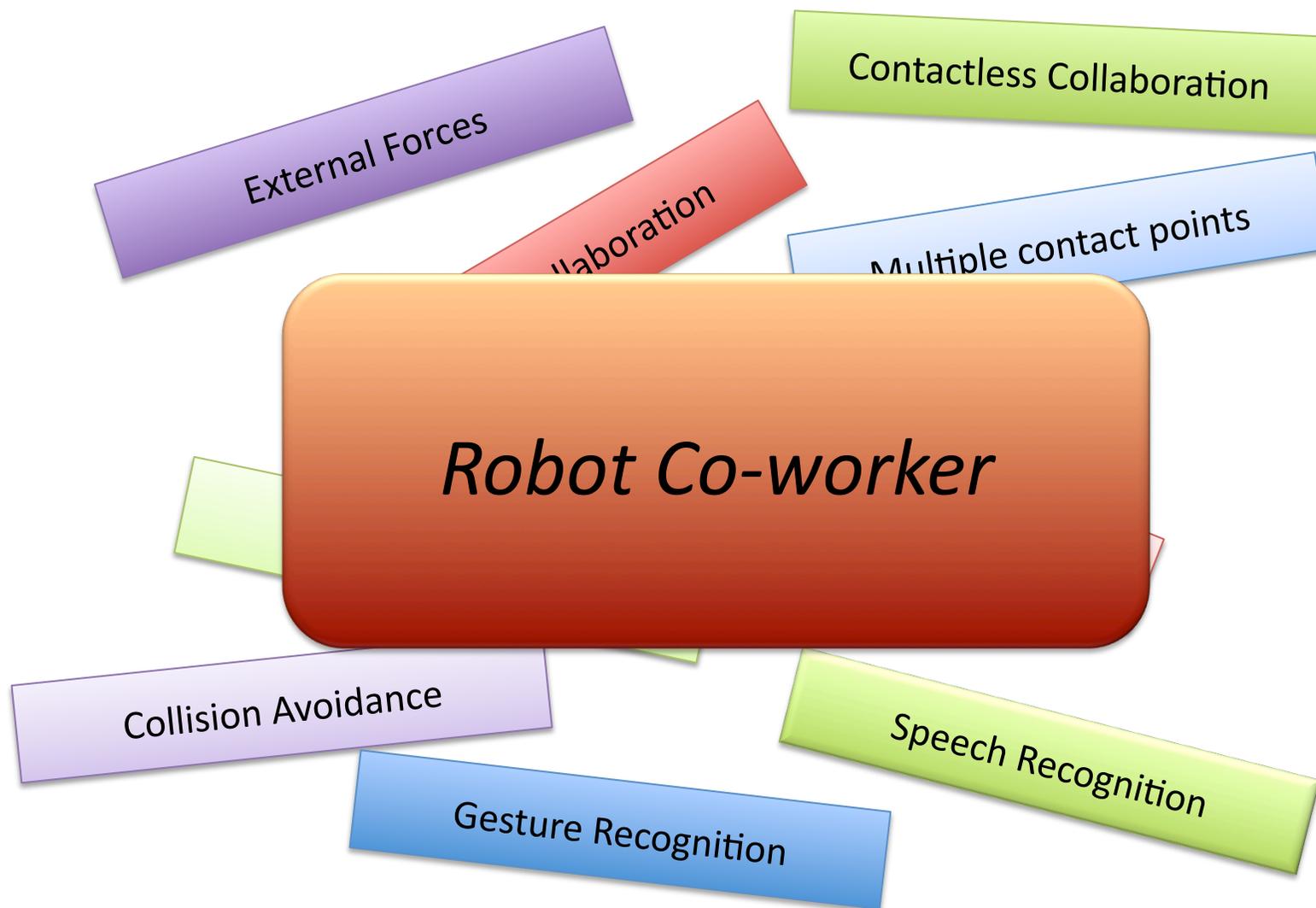


**Collaboration phase activated  
by the human**



# Safe collaboration

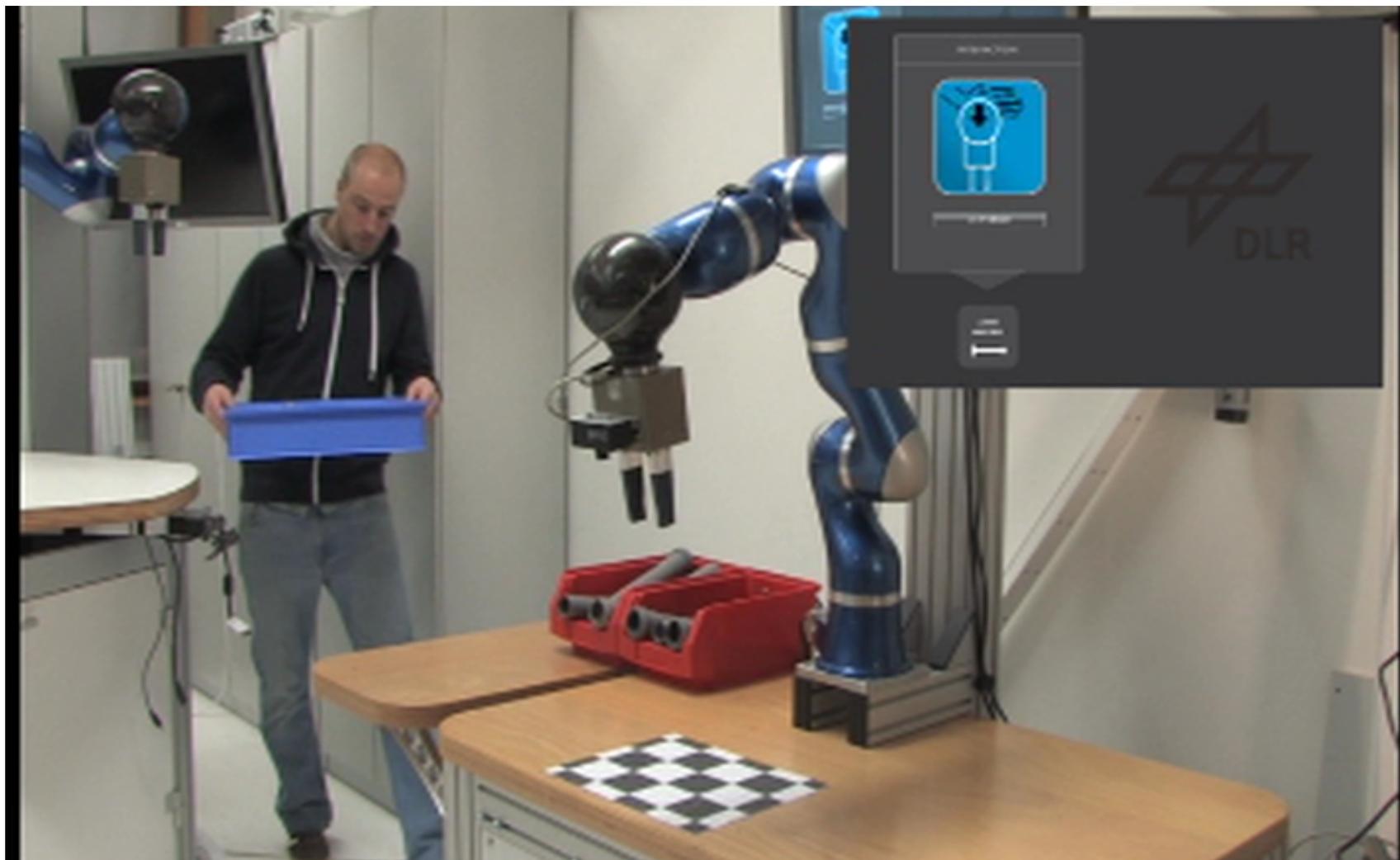
Merging all together





## Robot co-worker

Physical HRI during task execution, with friendly user interface (@DLR)





## A further use of pHRI

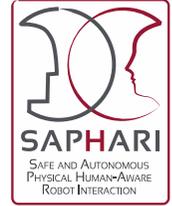
Learning by human imitation and incremental kinesthetic refinement (@TUM)





## Conclusions

Toward human-robot safe physical collaboration



- a **unified framework** for safe human-robot collaboration, based on a **hierarchy of consistent behaviours** that the robot must accomplish
  - residual-based collision **detection**
  - portfolio of collision **reaction** algorithms
  - collision **avoidance** based on depth space data
  - **gesture** and **speech** for contactless collaboration
  - **contact** force estimator

## Acknowledgements

Institute of Robotics and Mechatronics, **DLR** - Alin Albu-Schaffer, Sami Haddadin  
Artificial Intelligence Laboratory, **Stanford University** - Torsten Kroeger, Oussama Khatib

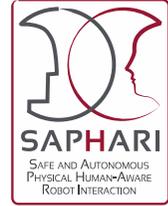
**@DIAG** – Fabrizio Flacco

Emanuele Magrini (voice-gesture interaction), Milad Geravand (Kuka KR5 physical interaction)



## Selected references

From EU projects FP6 PHRIENDS and FP7 SAPHARI



- A. De Luca, A. Albu-Schäffer, S. Haddadin, G. Hirzinger, “Collision detection and safe reaction with the DLR-III lightweight manipulator arm,” *2006 IEEE/RSJ Int. Conf. on Intelligent Robots and Systems*, pp. 1623-1630, 2006
- S. Haddadin, A. Albu-Schäffer, A. De Luca, G. Hirzinger, “Collision detection and reaction: A contribution to safe physical human-robot interaction,” *2008 IEEE/RSJ Int. Conf. on Intelligent Robots and Systems*, pp. 3356-3363, 2008
- A. De Luca, W. Book, “Robots with flexible elements,” in B. Siciliano, O. Khatib (Eds.) *Springer Handbook of Robotics*, Springer Verlag, pp. 287-319, 2008
- A. De Luca, F. Flacco, A. Bicchi, R. Schiavi, “Nonlinear decoupled motion-stiffness control and collision detection/reaction for the VSA-II variable stiffness device,” *2009 IEEE/RSJ Int. Conf. on Intelligent Robots and Systems*, pp. 5487-5494, 2009
- F. Flacco, A. De Luca, “Multiple depth/presence sensors: Integration and optimal placement for human/robot coexistence,” *2010 IEEE Int. Conf. on Robotics and Automation*, pp. 3916-3923, 2010
- F. Flacco, T. Kröger, A. De Luca, O. Khatib, “A depth space approach to human-robot collision avoidance,” *2012 IEEE Int. Conf. on Robotics and Automation*, pp. 338-345, 2012
- A. De Luca, F. Flacco, “Integrated control for pHRI: Collision avoidance, detection, reaction and collaboration,” *4th IEEE Int. Conf. on Biomedical Robotics and Biomechatronics*, pp. 288-295, 2012

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