



Robotics 2

Impedance Control

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Impedance control

- imposes a desired **dynamic behavior** to the interaction between robot end-effector and environment
- the desired performance is specified through a **generalized dynamic impedance**, namely a complete set of **mass-spring-damper** equations (typically chosen as linear and decoupled, but also nonlinear)
- a model describing how reaction forces are generated in association with environment deformation is not explicitly required
- suited for tasks in which **contact forces should be “kept small”**, while their accurate regulation is not mandatory
- since a control loop based on **force error** is missing, **forces** are only indirectly assigned **by controlling position**
- the choice of a specific stiffness in the impedance model along a Cartesian direction results in a trade-off between contact forces and position accuracy in that direction



Dynamic model of a robot in contact

$$N = M$$

$$B(q)\ddot{q} + S(q, \dot{q})\dot{q} + g(q) = u + J^T(q)F$$

generalized
Cartesian force

(linear) forces

$$F = \begin{pmatrix} \gamma \\ \mu \end{pmatrix} \in \mathbb{R}^M$$

(angular) torques

direct kinematics

$$J_a(q) = \frac{df(q)}{dq} = T_a(\phi)J(q)$$

"geometric"
Jacobian

$$v = \begin{pmatrix} \dot{p} \\ \omega \end{pmatrix} = J(q)\dot{q}$$

angular velocity

"analytic"
Jacobian

$$\dot{x} = \begin{pmatrix} \dot{p} \\ \dot{\phi} \end{pmatrix} = J_a(q)\dot{q}$$

derivative of
Euler angles

$$\dot{x} = T_a(\phi)v$$

$$B(q)\ddot{q} + S(q, \dot{q})\dot{q} + g(q) = u + J_a^T(q)F_a \quad \text{with } F_a = T_a^{-T}(\phi)F$$

generalized forces performing work on \dot{x}



Dynamic model in Cartesian coordinates

$$B_x(q)\ddot{x} + S_x(q, \dot{q})\dot{x} + g_x(q) = J_a^{-T}(q)u + F_a$$

with

$$B_x(q) = J_a^{-T}(q)B(q)J_a^{-1}(q)$$

$$S_x(q, \dot{q}) = J_a^{-T}(q) S(q, \dot{q}) J_a^{-1}(q) - B_x(q) \dot{J}_a(q, \dot{q}) J_a^{-1}(q)$$

$$g_x(q) = J_a^{-T}(q)g(q)$$

...and the usual structural properties

- $B_x(q) > 0$, if $J_a(q)$ is non-singular
- $\dot{B}_x - 2S_x$ is **skew-symmetric**, if $\dot{B} - 2S$ satisfies the same property
- the Cartesian dynamic model of the robot is **linearly parameterized** in terms of a set of dynamic coefficients

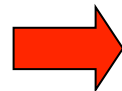


Design of the control law

designed in **two steps**:

1. **feedback linearization** in the Cartesian space

$$u = J_a^T(q) [B_x(q)a + S_x(q, \dot{q})\dot{x} + g_x(q) - F_a]$$



$$\ddot{x} = a$$

closed-loop system

2. imposition of a dynamic **impedance model**

most of the times
it is "decoupled"
(diagonal matrices)

$$B_m(\ddot{x} - \ddot{x}_d) + D_m(\dot{x} - \dot{x}_d) + K_m(x - x_d) = F_a$$

desired (apparent)
inertia (> 0)

desired
damping (≥ 0)

desired
stiffness (> 0)

external forces
from the environment

is realized by choosing

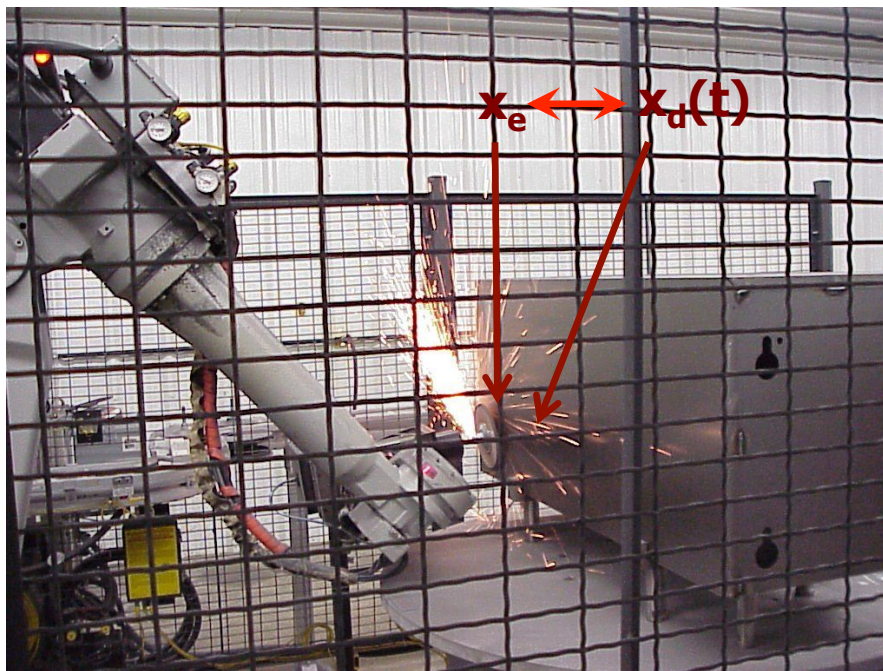
$$a = \ddot{x}_d + B_m^{-1} [D_m(\dot{x}_d - \dot{x}) + K_m(x_d - x) + F_a]$$

Note: $x_d(t)$ is the desired motion, which typically "slightly penetrates" inside the **compliant** environment (keeping thus contact)...

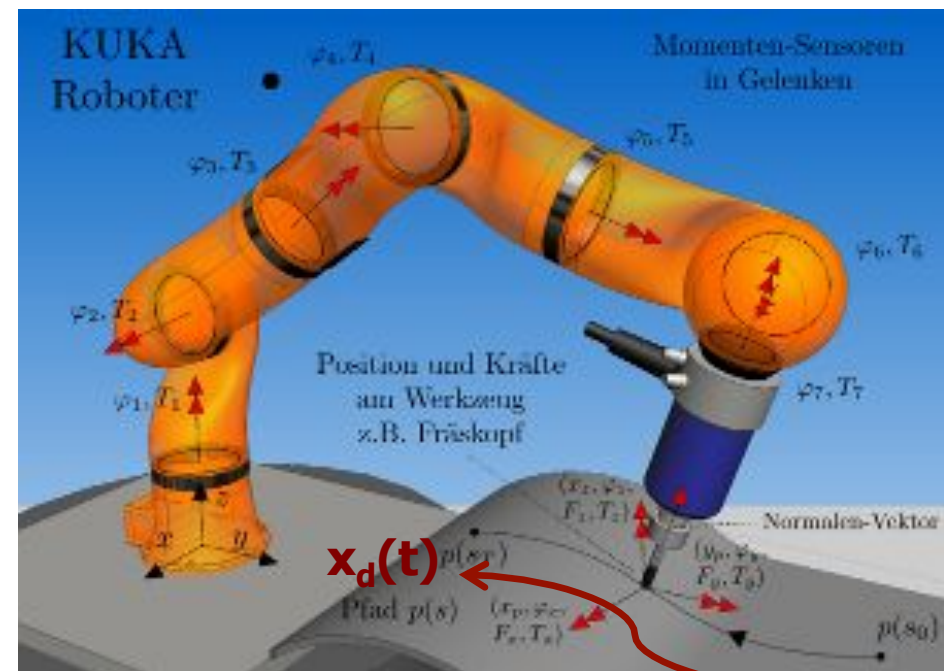
Examples of desired reference x_d in impedance/compliance control

$$B_m(\ddot{x} - \ddot{x}_d) + D_m(\dot{x} - \dot{x}_d) + K_m(x - x_d) = F_a$$

the desired motion $x_d(t)$ is **slightly inside**
the environment (keeping thus contact)



robot in grinding task

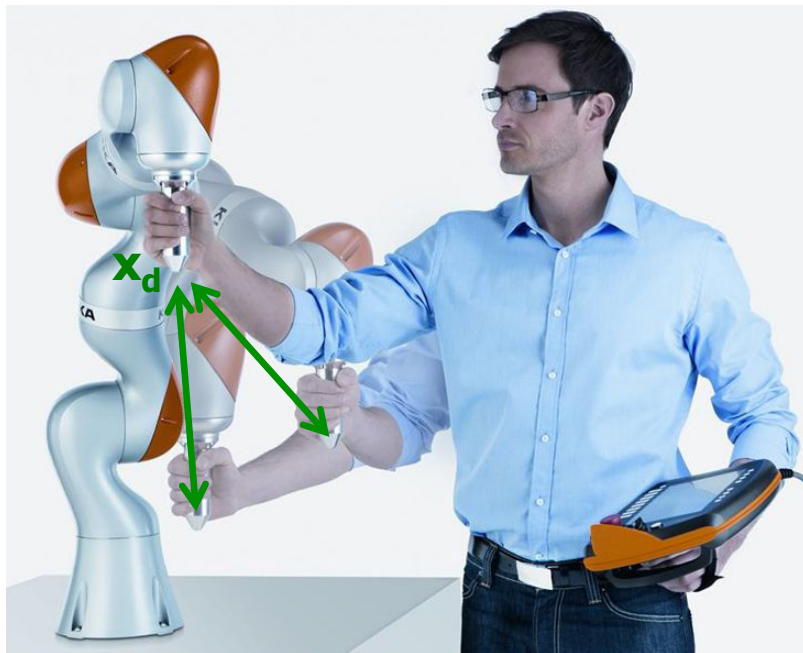


robot writing on a surface

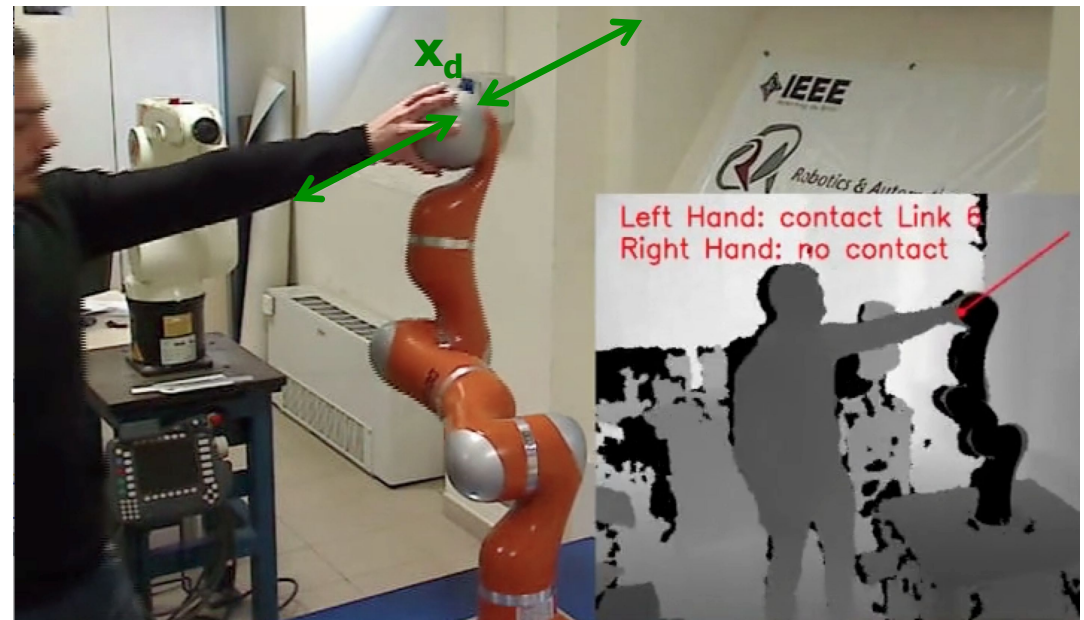
Examples of desired reference x_d in impedance/compliance control

$$B_m(\ddot{x} - \ddot{x}_d) + D_m(\dot{x} - \dot{x}_d) + K_m(x - x_d) = F_a$$

constant desired pose x_d is the free Cartesian **rest position** in a human-robot interaction task



KUKA iiwa robot with human operator



KUKA LWR robot in pHRI (collaboration)



Control law in joint coordinates

substituting and simplifying...

$$u = B(q)J_a^{-1}(q)\left\{\ddot{x}_d - \dot{J}_a(q)\dot{q} + B_m^{-1}\left[D_m(\dot{x}_d - \dot{x}) + K_m(x_d - x)\right]\right\} \\ + S(q, \dot{q})\dot{q} + g(q) + J_a^T(q)\underbrace{\left[B_x(q)B_m^{-1} - I\right]}_{\text{matrix weighting the measured contact forces}}F_a$$

matrix weighting the measured contact forces

- the following identity holds for the term involving contact forces

$$J_a^T(q)\left[B_x(q)B_m^{-1} - I\right]F_a = \left[B(q)J_a^{-1}(q)B_m^{-1} - J_a^T(q)\right]F_a$$

which **eliminates** from the control law also the appearance of the last remaining Cartesian quantity (the Cartesian inertia matrix)

- while the principle of control **design** is based on dynamic analysis and desired (impedance) behavior as described in the **Cartesian space**, the final control **implementation** is always made **at robot joint level**



Choice of the impedance model

rationale ...

- avoid large impact forces due to uncertain geometric characteristics (position, orientation) of the environment
- adapt/match to the dynamic characteristics (in particular, stiffness) of the environment, in a complementary way
- mimic the behavior of a human arm
 - ➔ fast and stiff in free motion, slow and compliant in “safeguarded” motion

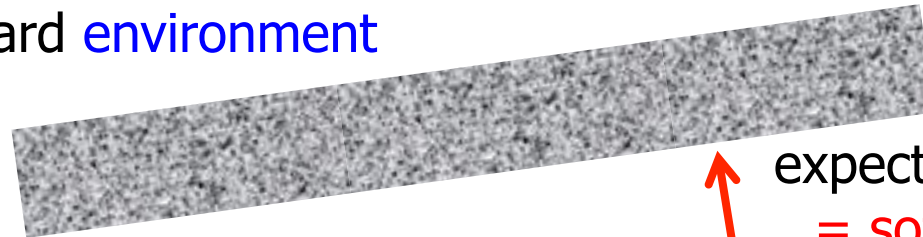


- large $B_{m,i}$ and small $K_{m,i}$ in Cartesian directions where contact is foreseen (➔ low contact forces)
- large $K_{m,i}$ and small $B_{m,i}$ in Cartesian directions that are supposed to be free (➔ good tracking of desired motion trajectory)
- damping coefficients $D_{m,i}$ are used to shape transient behaviors



Human arm behavior

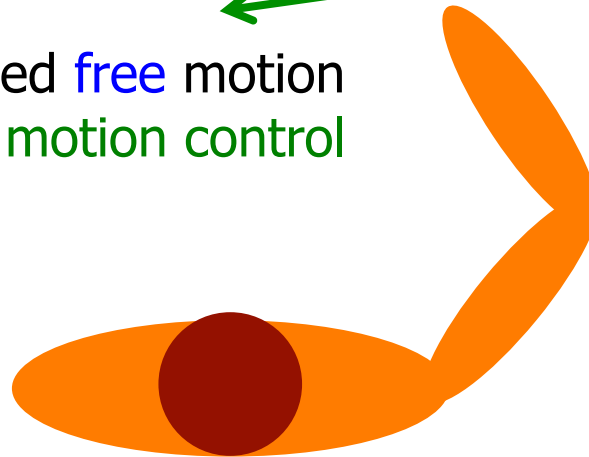
hard environment



expected contact motion
= soft motion control



expected free motion
= stiff motion control



in selected directions:

the stiffer is the environment, the softer is the chosen model stiffness $K_{m,i}$



A notable simplification - 1

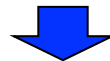
choose the **apparent inertia equal to** the **natural** Cartesian inertia of the robot

$$B_m = B_x(q) = J_a^{-T}(q)B(q)J_a^{-1}(q)$$

then, the control law becomes

$$u = B(q)J_a^{-1}(q)\left[\ddot{x}_d - \dot{J}_a(q)\dot{q}\right] + S(q,\dot{q})\dot{q} + g(q) \\ + J_a^T(q)\left[D_m(\dot{x}_d - \dot{x}) + K_m(x_d - x)\right]$$

WITHOUT contact force feedback! (a F/T sensor is no longer needed...)



actually, this is a **pure motion control** during interaction,
designed so as to keep **limited contact forces** at the end-effector level
(as before, K_m is chosen as a function of the **expected** environment stiffness)



A notable simplification - 2

technical issue: if the impedance model (now, nonlinear) is still supposed to represent a **real** mechanical system, then in correspondence to a desired **non-constant inertia** ($B_x(q)$) there should be **Coriolis and centrifugal** terms...

➔
$$B_x(q)(\ddot{x} - \ddot{x}_d) + (S_x(q, \dot{q}) + D_m)(\dot{x} - \dot{x}_d) + K_m(x - x_d) = F_a$$

nonlinear impedance model ("only" gravity terms disappear)

redoing computations, the control law becomes

$$u = B(q)J_a^{-1}(q)\left[\ddot{x}_d - \dot{J}_a(q)J_a^{-1}(q)\dot{x}_d\right] + S(q, \dot{q})J_a^{-1}(q)\dot{x}_d + g(q) + J_a^T(q)\left[D_m(\dot{x}_d - \dot{x}) + K_m(x_d - x)\right]$$

which is indeed slightly more complex, but has the following advantages:

- guarantee of asymptotic convergence to **zero tracking error** (on $x_d(t)$)
when $F_a = 0$ (no contact situation) \Rightarrow Lyapunov + skew-symmetry of $\dot{B}_x - 2S_x$
- further simplification **when x_d is constant**



Cartesian regulation revisited

(with no contact, $F_a = 0$)

if x_d is constant ($\dot{x}_d = 0$, $\ddot{x}_d = 0$), from the previous expression we obtain the control law

$$u = g(q) + J_a^T(q) [K_m(x_d - x) - D_m \dot{x}] \quad (*)$$

Cartesian PD with gravity cancelation...

when $F_a = 0$ (absence of contact), we know already that this law ensures asymptotic stability of x_d , provided $J_a(q)$ has full rank

proof
(alternative)

Lyapunov candidate $V_1 = \frac{1}{2} \dot{x}^T B_x(q) \dot{x} + \frac{1}{2} (x_d - x)^T K_m (x_d - x)$

$$\Rightarrow \dot{V}_1 = \dot{x}^T B_x(q) \ddot{x} + \frac{1}{2} \dot{x}^T \dot{B}_x(q) \dot{x} - \dot{x}^T K_m (x_d - x) = \dots = -\dot{x}^T D_m \dot{x} \leq 0$$

using skew-symmetry of $\dot{B}_x - 2S_x$ and $g_x = J_a^T g$



Cartesian stiffness control

(in contact, $F_a \neq 0$)

when $F_a \neq 0$, convergence to x_d is not assured
(it may not even be a closed-loop equilibrium...)

- for **analysis**, assume an **elastic contact model** for the environment

$$F_a = K_e(x_e - x) \quad \text{with stiffness } K_e \geq 0 \text{ and rest position } x_e$$

- closed-loop system behavior

Lyapunov candidate

$$\begin{aligned} V_2 &= \frac{1}{2} \dot{x}^T B_x(q) \dot{x} + \frac{1}{2} (x_d - x)^T K_m (x_d - x) + \frac{1}{2} (x_e - x)^T K_e (x_e - x) \\ &= V_1 + \frac{1}{2} (x_e - x)^T K_e (x_e - x) \end{aligned}$$

$$\begin{aligned} \Rightarrow \dot{V}_2 &= \dot{x}^T B_x(q) \ddot{x} + \frac{1}{2} \dot{x}^T \dot{B}_x(q) \dot{x} - \dot{x}^T K_m (x_d - x) - \dot{x}^T K_e (x_e - x) \\ &= \dots = -\dot{x}^T D_m \dot{x} + \dot{x}^T (F_a - K_e (x_e - x)) = -\dot{x}^T D_m \dot{x} \leq 0 \end{aligned}$$



Stability analysis (with $F_a \neq 0$)

when $\dot{x} = \ddot{x} = 0$, at the closed-loop system **equilibrium** it is

$K_m(x_d - x) + K_e(x_e - x) = 0$, which has the **unique** solution

$$x = (K_m + K_e)^{-1} (K_m x_d + K_e x_e) =: x_E$$

(check that the Lyapunov candidate V_2 has in fact its **minimum** in x_E !!)

LaSalle \Rightarrow x_E **asymptotically stable equilibrium**

$$x_E \approx \begin{cases} x_e & \text{for } K_e \gg K_m \text{ (rigid environment)} \\ x_d & \text{for } K_m \gg K_e \text{ (rigid controller)} \end{cases}$$

Note: the Cartesian stiffness control law (*) is often called also **compliance control** in the literature



"Active" equivalent of RCC device

- IF
- displacement from the desired position x_d are **small**, namely
$$(x_d - x) \approx J_a(q_d - q)$$
 - $g(q) = 0$ (gravity is compensated/canceled, e.g. mechanically)
 - $D_m = 0$

THEN

$$u = J_a^T(q) K_m J_a(q) (q_d - q) = K_x(q) (q_d - q)$$



a **variable joint level stiffness** $K_x(q)$ corresponds to a
constant Cartesian level stiffness K_m (and **vice versa**)

active counterpart of the Remote Center of Compliance (**RCC**) device