



Robotics 1

Trajectory planning in Cartesian space

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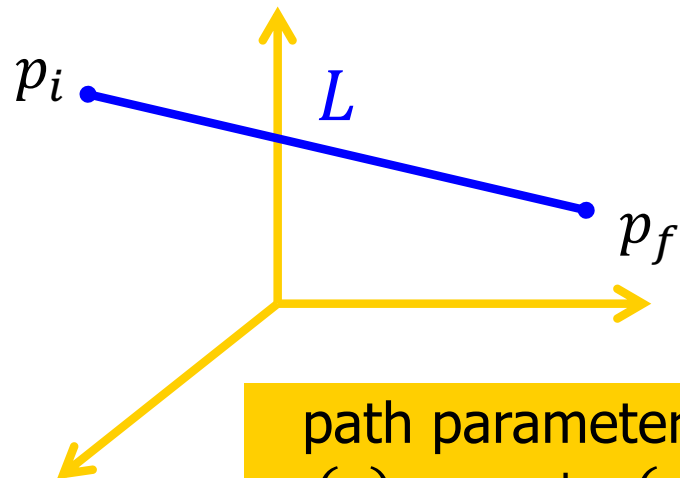


Trajectories in Cartesian space

- in general, the trajectory planning methods proposed in the joint space can be applied also in the Cartesian space
 - consider **independently** each component of the task vector (i.e., a position or an angle of a minimal representation of orientation)
- however, when planning a trajectory for the three orientation angles, the resulting global motion cannot be intuitively **visualized** in advance
- if possible, we still prefer to plan Cartesian trajectories **separately** for **position** and **orientation**
- the number of knots to be interpolated in the Cartesian space is typically low (e.g., 2 knots for a PTP motion, 3 if a "via point" is added) \Rightarrow use **simple** interpolating paths, such as straight lines, arc of circles, ...



Planning a linear Cartesian path (position only)



GIVEN

$p_i, p_f \in \mathbb{R}^3; v_i, v_f \in \mathbb{R}$ (typically = 0);
bounds $v_{max}, a_{max} \in \mathbb{R}^+$

$$L = \|p_f - p_i\|$$

path parameterization
 $p(s) = p_i + s(p_f - p_i)$

$\frac{p_f - p_i}{\|p_f - p_i\|} =$ unit vector of directional
cosines of the line

$$s \in [0,1]$$

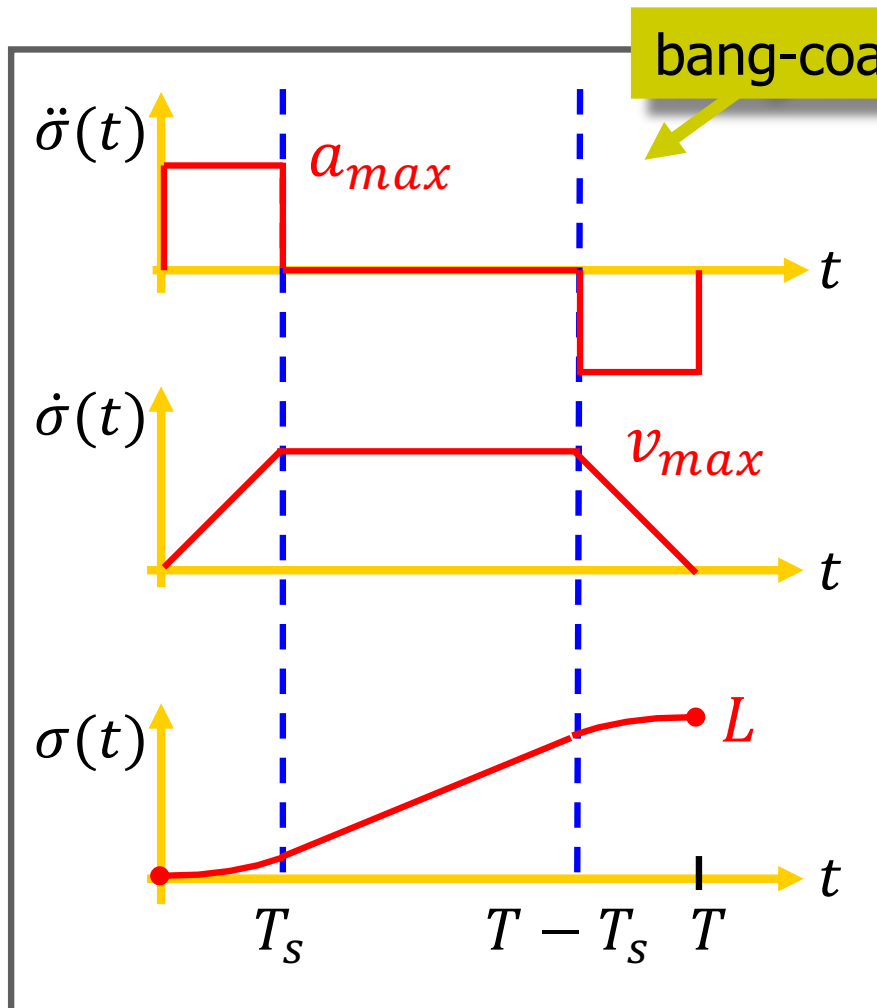
may also use $s = \sigma/L$, where $\sigma \in [0, L]$ is the
arc length (gives the current length of the path)

$$\begin{aligned}\dot{p}(s) &= \frac{dp}{ds} \dot{s} = (p_f - p_i) \dot{s} \\ &= \frac{p_f - p_i}{L} \dot{\sigma}\end{aligned}$$

$$\begin{aligned}\ddot{p}(s) &= \cancel{\frac{d^2p}{ds^2}} \dot{s}^2 + \frac{dp}{ds} \ddot{s} = (p_f - p_i) \ddot{s} \\ &= \frac{p_f - p_i}{L} \ddot{\sigma}\end{aligned}$$



Timing law with trapezoidal speed - 1



given*: L, v_{max}, a_{max}
find: T_s, T

$$v_{max} (T - T_s) = L \quad \leftarrow \text{= area of the speed profile}$$

$$T_s = \frac{v_{max}}{a_{max}}$$

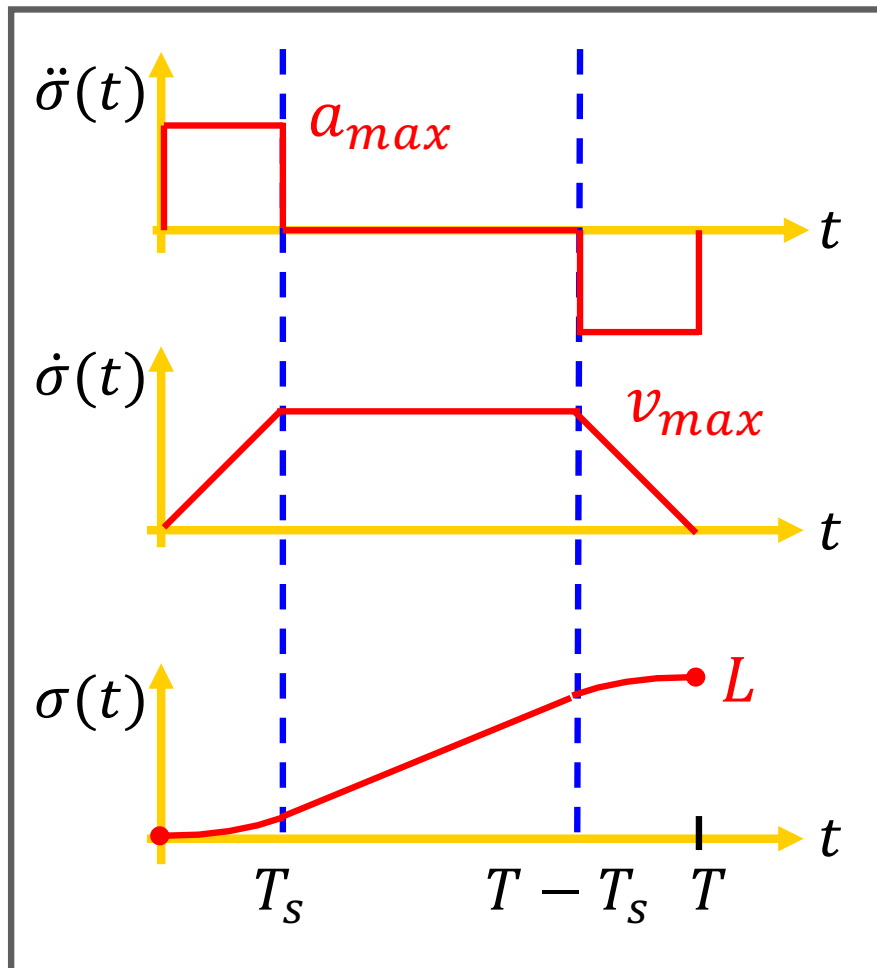
$$T = \frac{La_{max} + v_{max}^2}{a_{max}v_{max}}$$

a "coast" phase exists iff $L > v_{max}^2/a_{max}$

* = other input data combinations are possible (see textbook)



Timing law with trapezoidal speed - 2



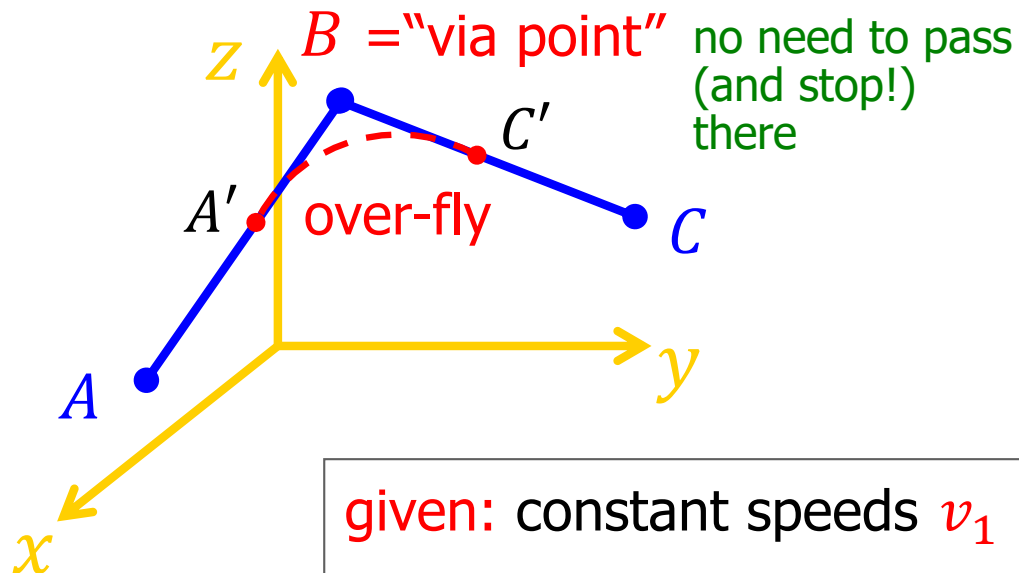
$$\sigma(t) = \begin{cases} \frac{a_{max}t^2}{2}, & t \in [0, T_s] \\ v_{max}t - \frac{v_{max}^2}{2a_{max}}, & t \in [T_s, T - T_s] \\ -\frac{a_{max}(t-T)^2}{2} + v_{max}T - \frac{v_{max}^2}{a_{max}}, & t \in [T - T_s, T] \end{cases} = L$$

discontinuous acceleration profile!
if needed, use for instance a
a rest-to-rest quintic polynomial timing

can be used also in the joint space!



Concatenation of linear paths



$$\frac{B - A}{\|B - A\|} = K_{AB}$$

$$\frac{C - B}{\|C - B\|} = K_{BC}$$

unit vectors of
directional cosines

given: constant speeds v_1 on linear path AB

v_2 on linear path BC

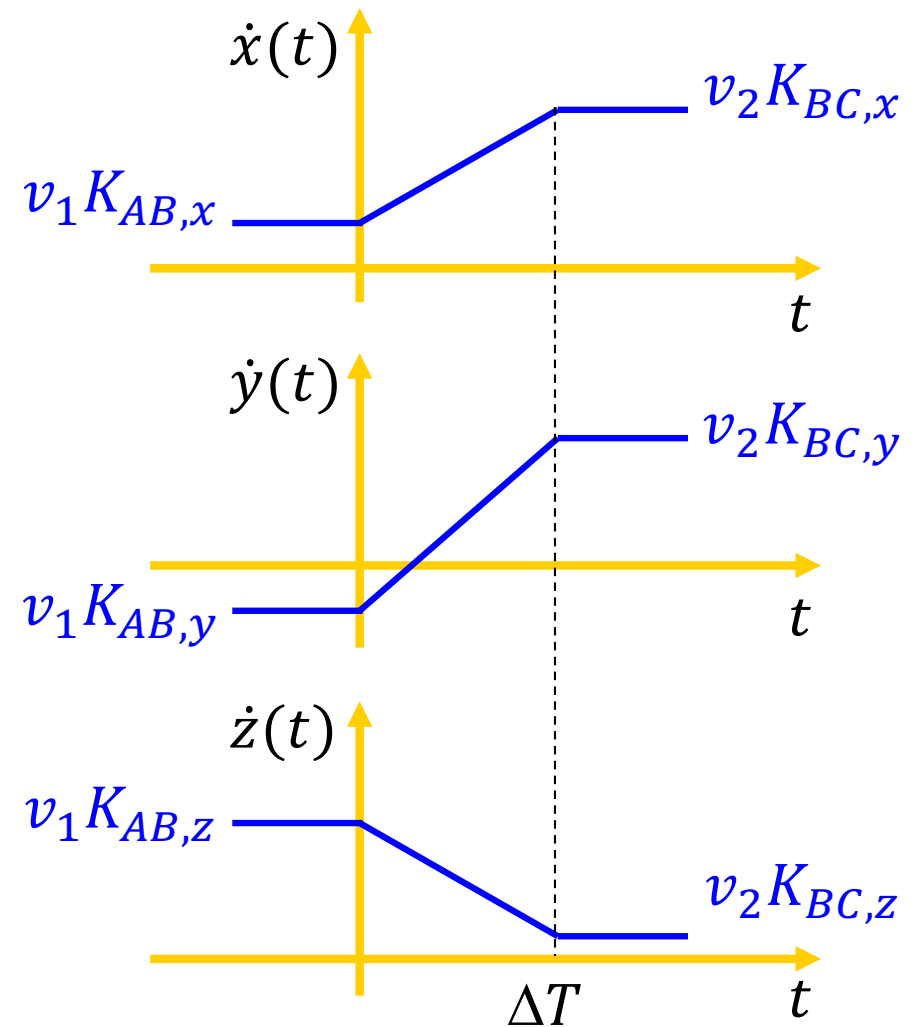
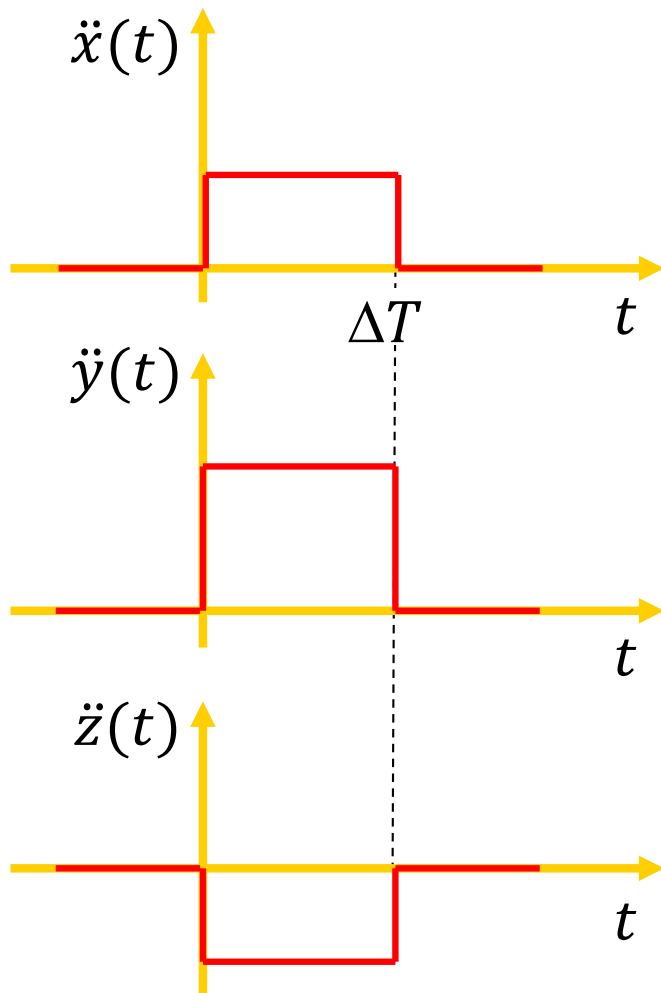
desired transition: with constant acceleration for a time ΔT

$$p(t) = \begin{pmatrix} x(t) \\ y(t) \\ z(t) \end{pmatrix} \quad t \in [0, \Delta T] \quad (\text{transition starts at } t = 0)$$

note: during over-fly, the path remains always in the plane specified by the two lines intersecting at B (in essence, it is a planar problem)

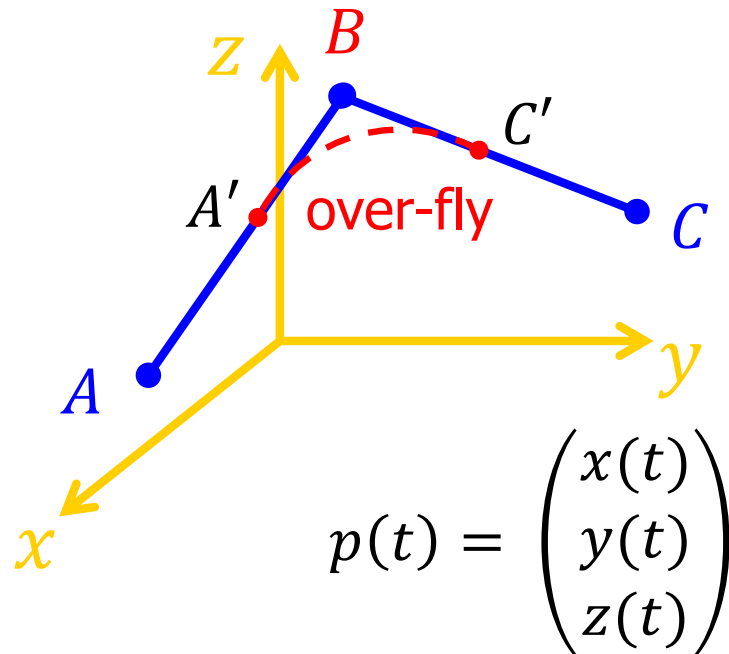


Time profiles on components





Timing law during transition



$$\frac{B - A}{\|B - A\|} = K_{AB}$$

$$\frac{C - B}{\|C - B\|} = K_{BC}$$

unit vectors of
directional cosines

$t \in [0, \Delta T]$ (transition **starts** at $t = 0$)

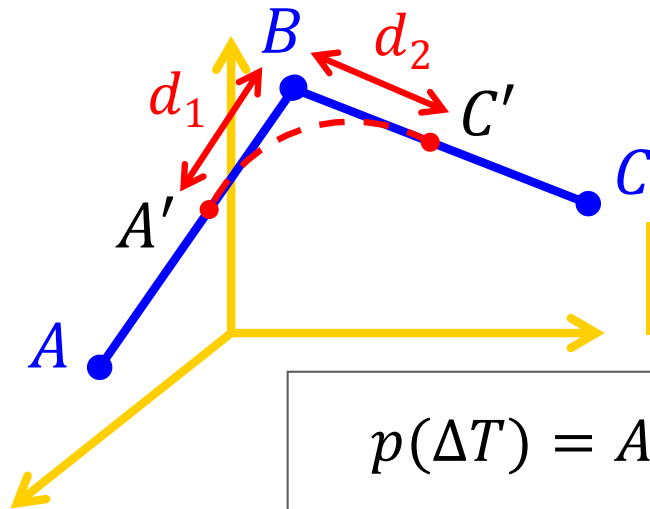
$$\ddot{p}(t) = (v_2 K_{BC} - v_1 K_{AB}) / \Delta T \quad \xrightarrow{\int} \quad \dot{p}(t) = v_1 K_{AB} + (v_2 K_{BC} - v_1 K_{AB}) t / \Delta T$$

$$p(t) = A' + v_1 K_{AB} t + (v_2 K_{BC} - v_1 K_{AB}) t^2 / (2\Delta T)$$

thus, we obtain a
parabolic blending
(see textbook
for this same approach
in the joint space)

Solution

(various options)



$$B - A' = d_1 K_{AB}$$

$$C' - B = d_2 K_{BC}$$

①

$$p(t) = A' + v_1 K_{AB} t + (v_2 K_{BC} - v_1 K_{AB}) t^2 / (2\Delta T)$$

$$p(\Delta T) = A' + (\Delta T/2)(v_1 K_{AB} + v_2 K_{BC}) = C'$$

$$\longrightarrow -B + A' + (\Delta T/2)(v_1 K_{AB} + v_2 K_{BC}) = C' - B$$

$$\textcircled{1} \longrightarrow d_1 K_{AB} + d_2 K_{BC} = (\Delta T/2)(v_1 K_{AB} + v_2 K_{BC})$$

$$\longrightarrow \boxed{d_1 = v_1 \Delta T / 2} \quad \boxed{d_2 = v_2 \Delta T / 2}$$

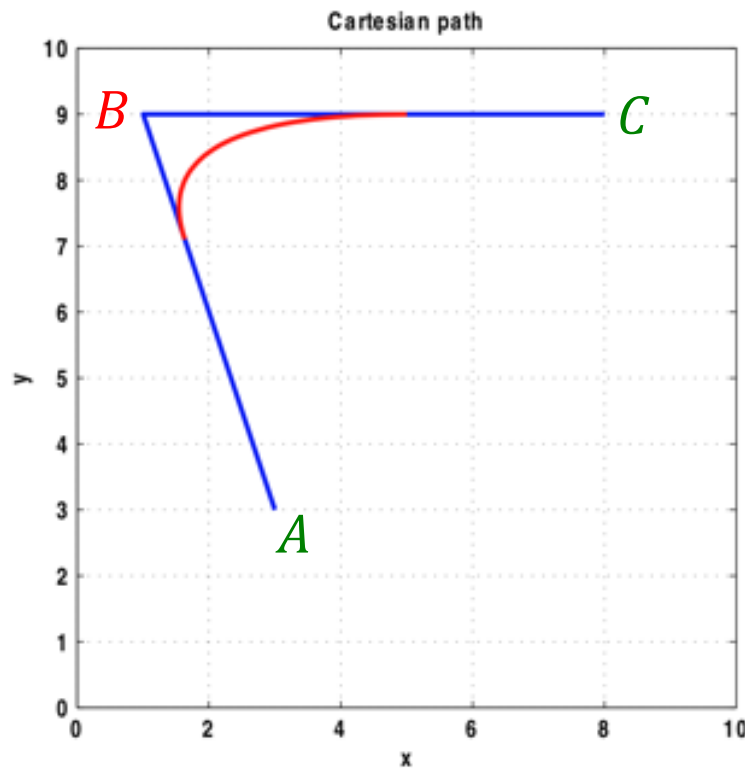
by choosing, e.g., d_1
(namely A')

$$\longrightarrow \boxed{\Delta T = 2d_1 / v_1 \longrightarrow d_2 = d_1 v_2 / v_1}$$

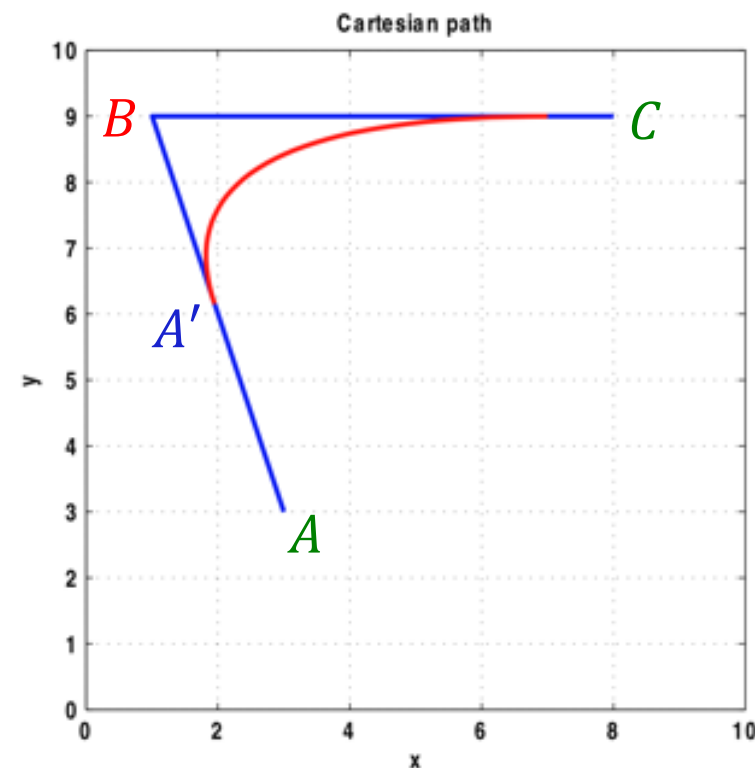


A numerical example

- transition: $A = (3,3)$ to $C = (8,9)$ via $B = (1,9)$, with speed from $v_1 = 1$ to $v_2 = 2$
- exploiting **two options** for solution (resulting in **different paths!**)
 - assign transition time: $\Delta T = 4$ (we re-center it here for $t \in [-\Delta T/2, \Delta T/2]$)
 - assign distance from B for departing: $d_1 = 3$ (assign d_2 for landing is handled similarly)



$$\Delta T = 4$$



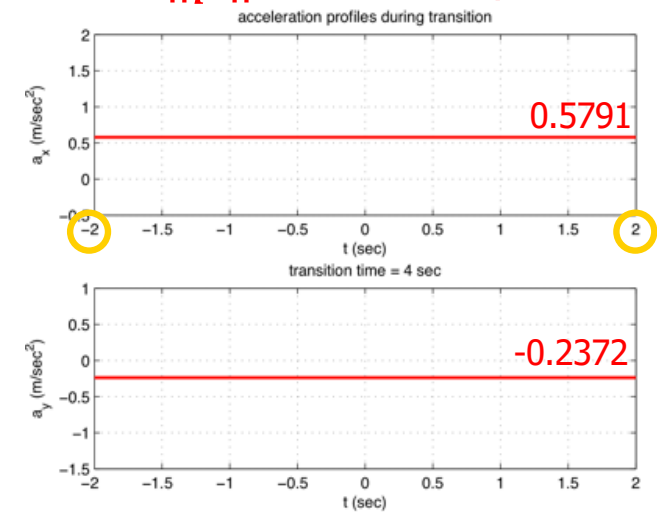
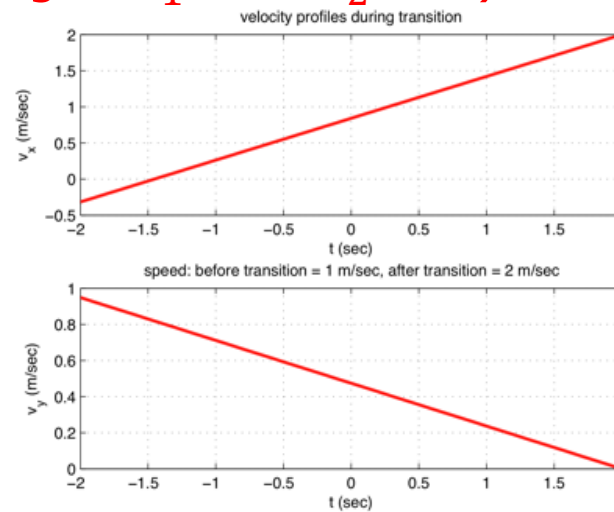
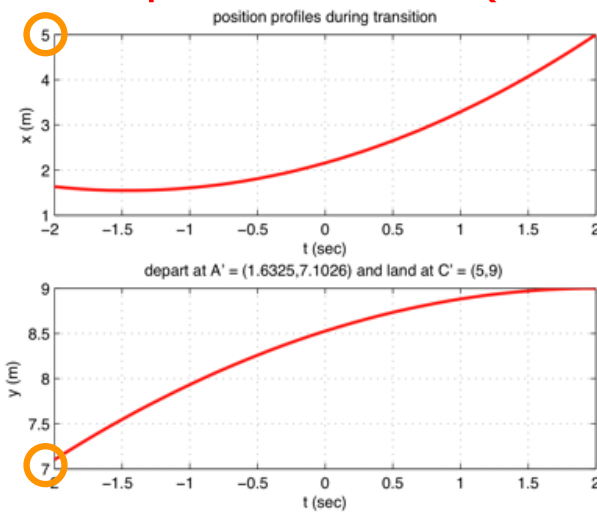
$$d_1 = 3$$



A numerical example (cont'd)

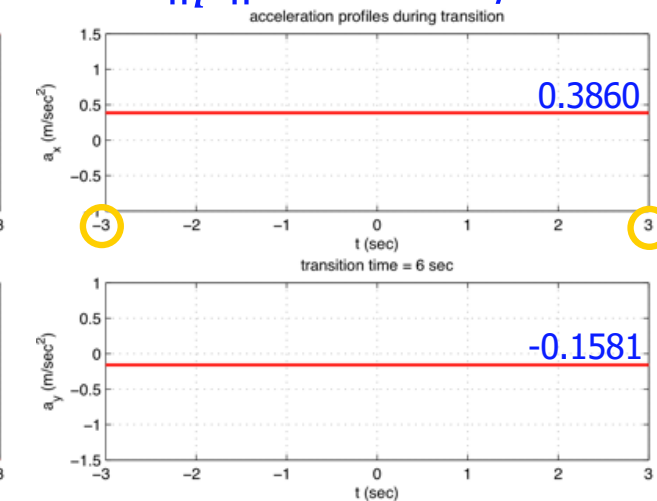
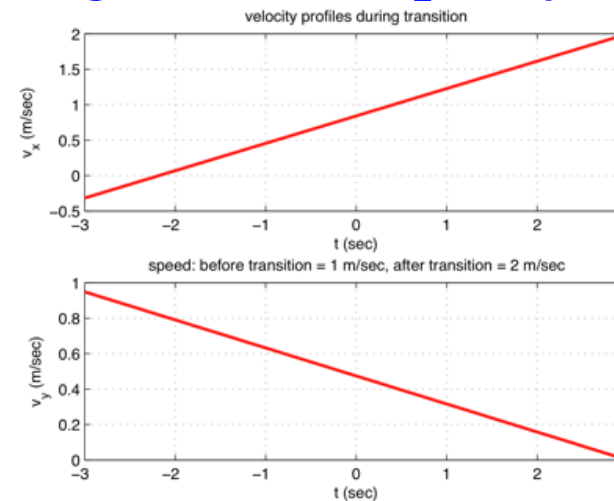
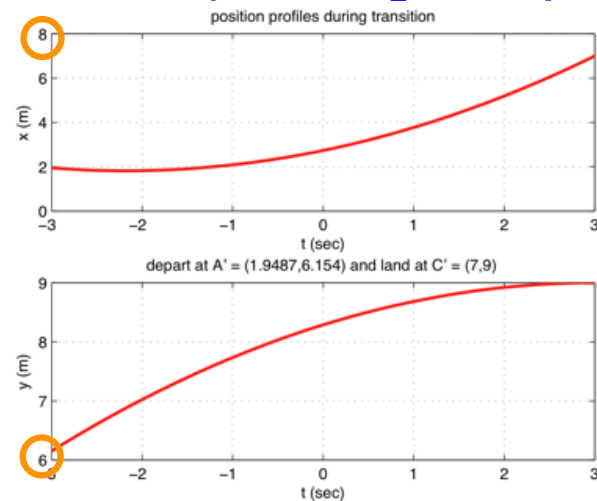
first option: $\Delta T = 4$ (resulting in $d_1 = 2, d_2 = 4$)

$$\Rightarrow \|\ddot{p}\| = 0.39 \text{ m/s}^2$$



second option: $d_1 = 3$ (resulting in $\Delta T = 6, d_2 = 6$)

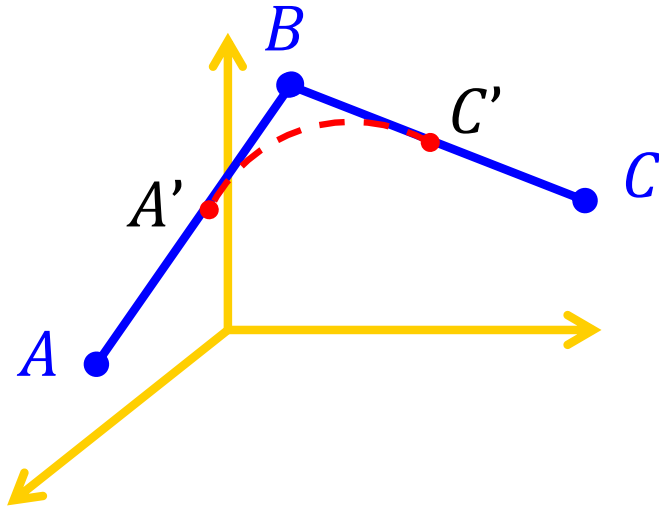
$$\Rightarrow \|\ddot{p}\| = 0.17 \text{ m/s}^2$$



actually: similar velocity/acceleration profiles, but with a different time scale!!



Alternative solution (imposing acceleration)



$$\ddot{p}(t) = (v_2 K_{BC} - v_1 K_{AB}) / \Delta T$$

$$v_1 = v_2 = v_{max} \text{ (for simplicity)}$$

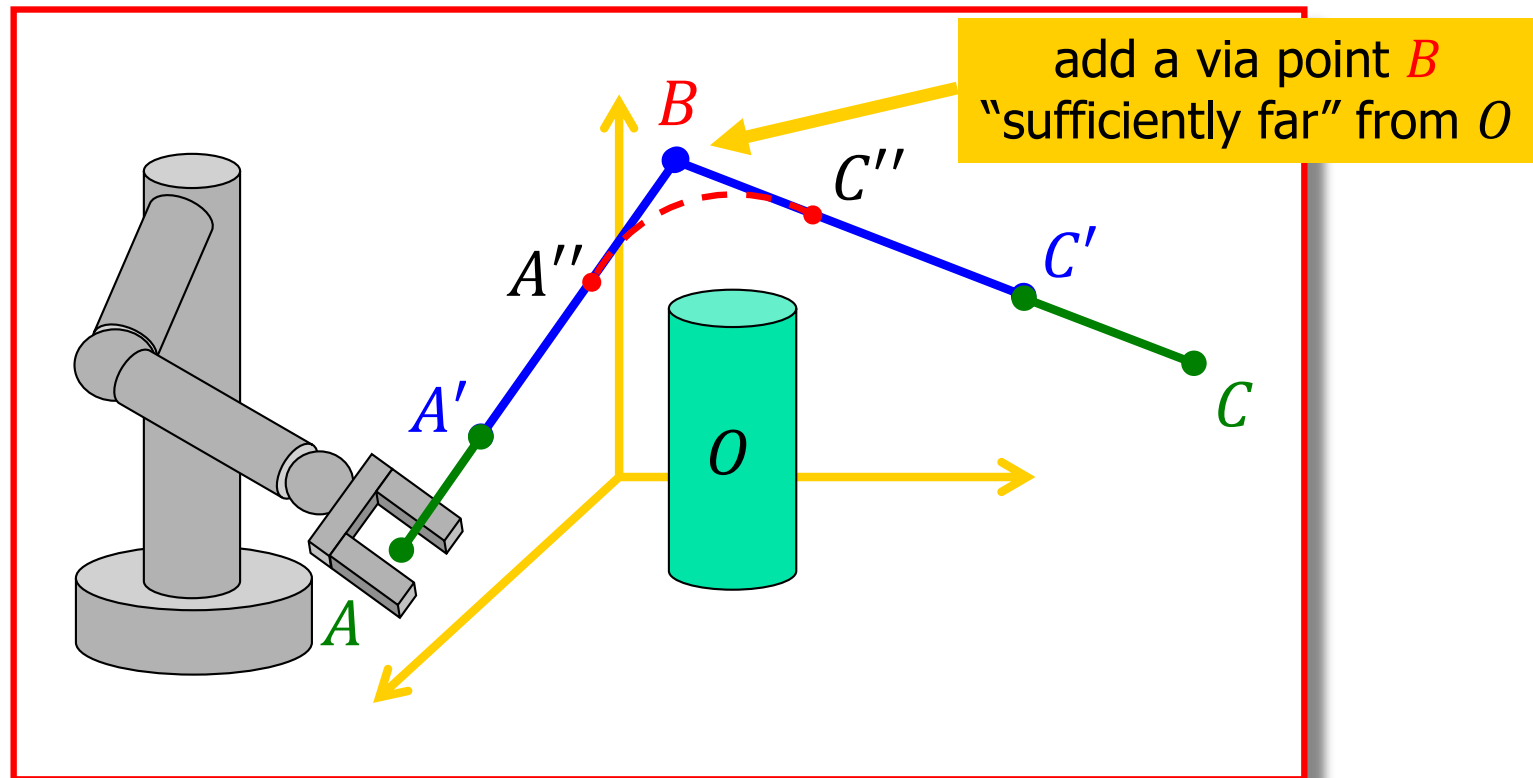
$$\|\ddot{p}(t)\| = a_{max}$$

$$\begin{aligned} \Delta T &= (v_{max} / a_{max}) \|K_{BC} - K_{AB}\| \\ &= (v_{max} / a_{max}) \sqrt{2(1 - K_{BC,x}K_{AB,x} - K_{BC,y}K_{AB,y} - K_{BC,z}K_{AB,z})} \end{aligned}$$

$$\text{then, } d_1 = d_2 = v_{max} \Delta T / 2$$

Application example

plan a Cartesian trajectory from A to C (rest-to-rest)
that avoids the obstacle O , with $a \leq a_{max}$ and $v \leq v_{max}$



on $\overline{AA'}$ $\rightarrow a_{max}$; on $\overline{A'B}$ and $\overline{BC'}$ $\rightarrow v_{max}$; on $\overline{C'C}$ $\rightarrow -a_{max}$;
+ over-fly between A'' e C'' (e.g., with a_{max} in norm)



Other Cartesian paths

- **circular path** through 3 points in 3D (often built-in feature)
- linear path for the end-effector with **constant orientation**
- in robots with **spherical wrist**: planning may be **decomposed** into a path for wrist center and one for E-E orientation, with a common timing law
- though more complex in general, it is often **convenient** to parameterize the Cartesian geometric path $p(s)$ in terms of its **arc length** (e.g., with $s = R\theta$ for circular paths), so that the following hold:
 - **velocity** $\dot{p} = dp/dt = (dp/ds)(ds/dt) = p'\dot{s}$
 - $p' =$ unit vector ($\|\cdot\| = 1$) tangent to the path \Rightarrow **tangent** direction $t(s)$
 - $\dot{s} \geq 0$ is the absolute value of the tangential velocity (= **speed**)
 - **acceleration** $\ddot{p} = (d^2p/ds^2)(ds/dt)^2 + (dp/ds)(d^2s/dt^2) = p''\dot{s}^2 + p'\ddot{s}$
 - $\|p''\| =$ **curvature** $\kappa(s)$ ($= 1/\text{radius of curvature}$)
 - $p''\dot{s}^2 =$ **centripetal** acceleration \Rightarrow **normal** direction $n(s) \perp$ to the path, on the osculating plane; the **binormal** direction is $b(s) = t(s) \times n(s)$
 - $\ddot{s} =$ scalar value (**with any sign**) of the tangential acceleration

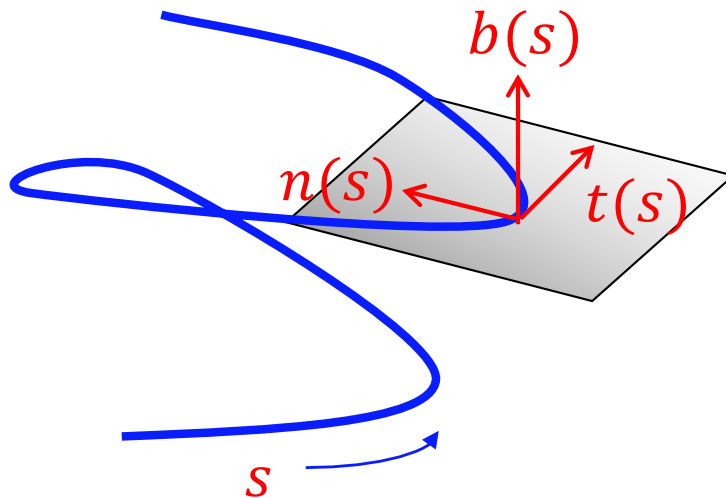


Definition of Frenet frame

- for a smooth and non-degenerate curve $p(s) \in \mathbb{R}^3$, parameterized by s (**not** necessarily its arc length), one can define a reference frame as shown

$$p' = dp/ds \quad p'' = d^2p/ds^2$$

derivatives w.r.t. the parameter s



unit tangent vector

$$t(s) = p'(s) / \|p'(s)\|$$

unit normal vector (\in osculating plane)

$$n(s) = t'(s) / \|t'(s)\|$$
$$= p'(s) \times (p''(s) \times p'(s)) / (\|p'(s)\| \cdot \|p''(s) \times p'(s)\|)$$

unit binormal vector

$$b(s) = t(s) \times n(s)$$
$$= p'(s) \times p''(s) / \|p'(s) \times p''(s)\|$$

- general expressions of path **curvature** and **torsion** (at a path point $p(s)$)

$$\kappa(s) = \|p'(s) \times p''(s)\| / \|p'(s)\|^3$$

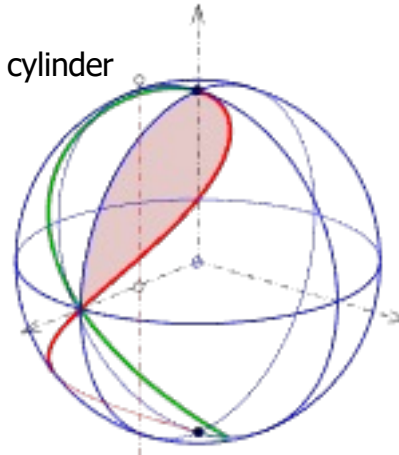
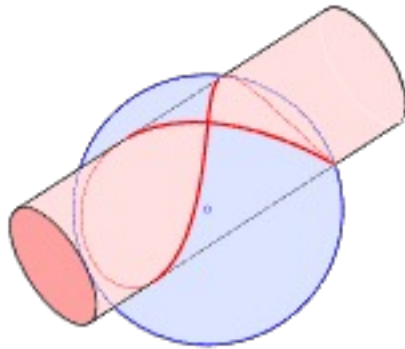
$$\tau(s) = [p'(s) \cdot (p''(s) \times p'''(s))] / \|p'(s) \times p''(s)\|^2$$



Examples of paths with Frenet frame

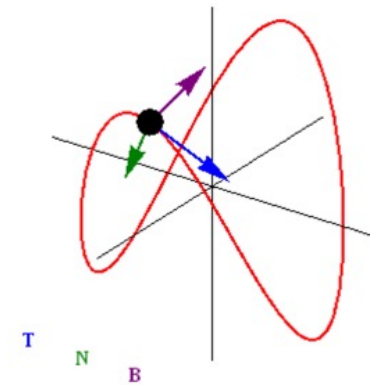
Viviani curve

= intersection of a sphere with a tangent cylinder



$$\begin{aligned} x &= r \cos^2 s \\ y &= r \cos s \sin s \\ z &= r \sin s \\ s &\in [-\pi/2, \pi/2] \end{aligned}$$

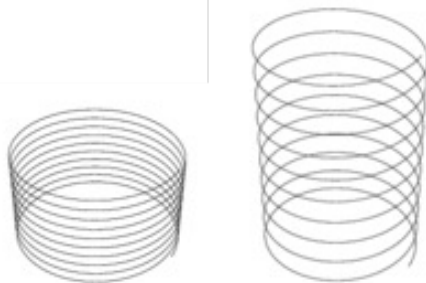
$$\begin{aligned} x &= r \cos^2 s \\ y &= -r \cos s \sin s \\ z &= -r \sin s \end{aligned}$$



By Ag2gaeh - <https://commons.wikimedia.org/w/index.php?curid=81698760>

By Gonfer <https://commons.wikimedia.org/w/index.php?curid=18558097>

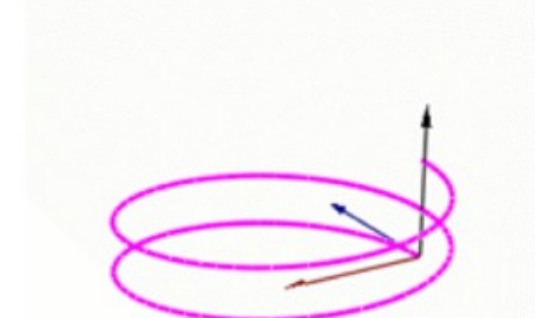
Helix curve (right handed)



$$\begin{aligned} x &= r \cos s \\ y &= r \sin s \\ z &= h s \\ s &\in [0, 2\pi] \end{aligned}$$



$$\begin{aligned} \kappa &= \frac{r}{r^2 + h^2} \\ \tau &= \frac{h}{r^2 + h^2} \end{aligned}$$



By Goldencako - <https://commons.wikimedia.org/w/index.php?curid=7519084>

Exercise

given the path $p(s) = \begin{pmatrix} 6s + 2 \\ 5s^2 \\ -8s \end{pmatrix}, s \in [0, 1]$



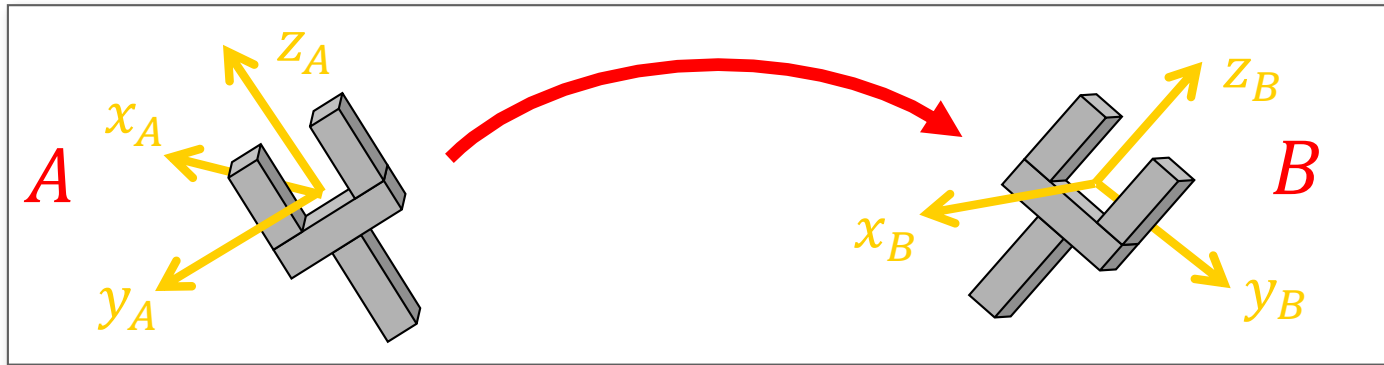
- define the Frenet frame $\{t(s), n(s), b(s)\}$
- compute the curvature $\kappa(s)$ and the torsion $\tau(s)$



Optimal trajectories

- for Cartesian robots (e.g., PPP joints)
 1. the straight line joining two position points in the Cartesian space is **one** path that can be executed in **minimum time** under velocity/acceleration constraints (but other such paths exist, if (joint) motion is **not coordinated**)
 2. the optimal timing law is of the bang-coast-bang type in **acceleration** (in this special case, also in terms of motor **torques**)
- for articulated robots (with at least one R joint)
 - 1. e 2. are no longer true in general in the **Cartesian** space, but time-optimality still holds in the **joint** space when assuming **bounds** on **joint velocity/acceleration**
 - straight line paths in the joint space **do not correspond** to straight line paths in the Cartesian space, and vice-versa
 - bounds on joint acceleration are **conservative** (though **kinematically tractable**) w.r.t. actual bounds on motor torques, which involve the full robot dynamics
 - when changing robot configuration/state, different torque values are needed to impose the same joint accelerations ...

Planning orientation trajectories



- using minimal representations of orientation (e.g., ZXZ **Euler** angles ϕ, θ, ψ), we can plan a trajectory for each component independently
 - e.g., a linear path in space ϕ, θ, ψ , with a cubic timing law
 - ⇒ but **poor prediction/understanding** of the resulting intermediate orientations
- **alternative method** based on the **axis/angle representation**
 - determine the (neutral) axis r and the angle θ_{AB} : $R(r, \theta_{AB}) = R_A^T R_B$ (rotation matrix changing the orientation from A to B ⇒ inverse axis-angle problem)
 - plan a timing law $\theta(t)$ for the (scalar) angle interpolating $\theta = 0$ with $\theta = \theta_{AB}$ in time T (with possible constraints/boundary conditions on its time derivatives)
 - $\forall t \in [0, T], R_A R(r, \theta(t))$ specifies the actual end-effector orientation at time t

A complete position/orientation Cartesian trajectory



- initial **given** configuration $q(0) = (0 \quad \pi/2 \quad 0 \quad 0 \quad 0 \quad 0)^T$
- **initial** end-effector position $p(0) = (0.540 \quad 0 \quad 1.515)^T$
- **initial** orientation

$$R(0) = \begin{pmatrix} 0 & 0 & 1 \\ 0 & -1 & 0 \\ 1 & 0 & 0 \end{pmatrix}$$

linear path
for position

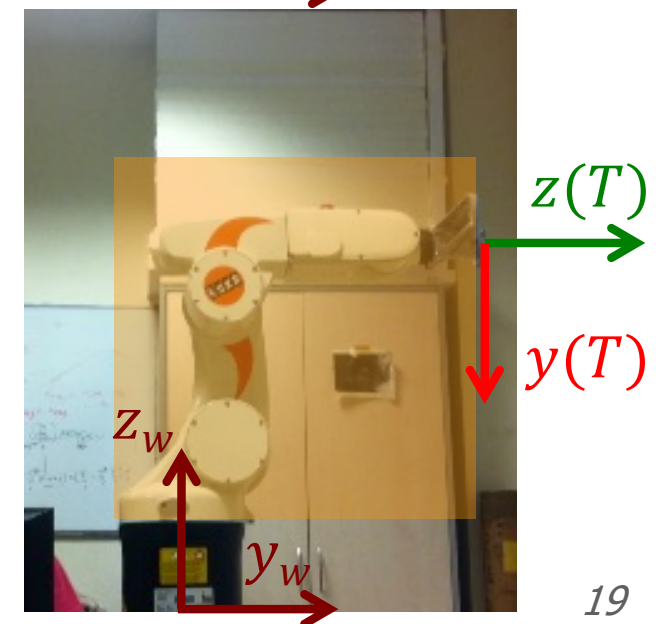
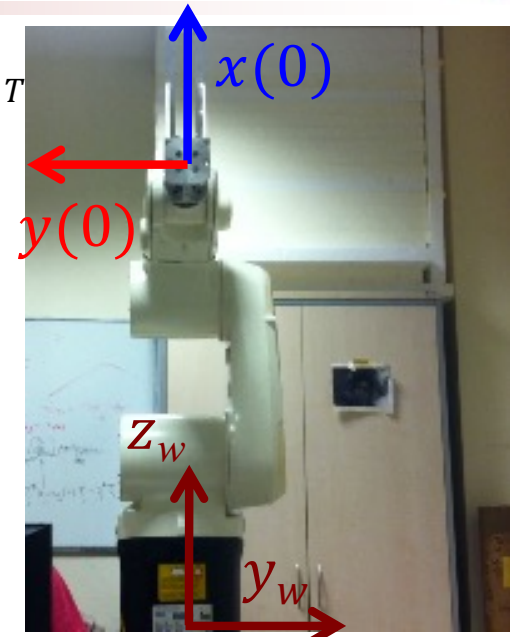


axis-angle method
for orientation

- **final** end-effector position $p(T) = (0 \quad 0.540 \quad 1.515)^T$
- **final** orientation

$$R(T) = \begin{pmatrix} 1 & 0 & 0 \\ 0 & 0 & 1 \\ 0 & -1 & 0 \end{pmatrix}$$

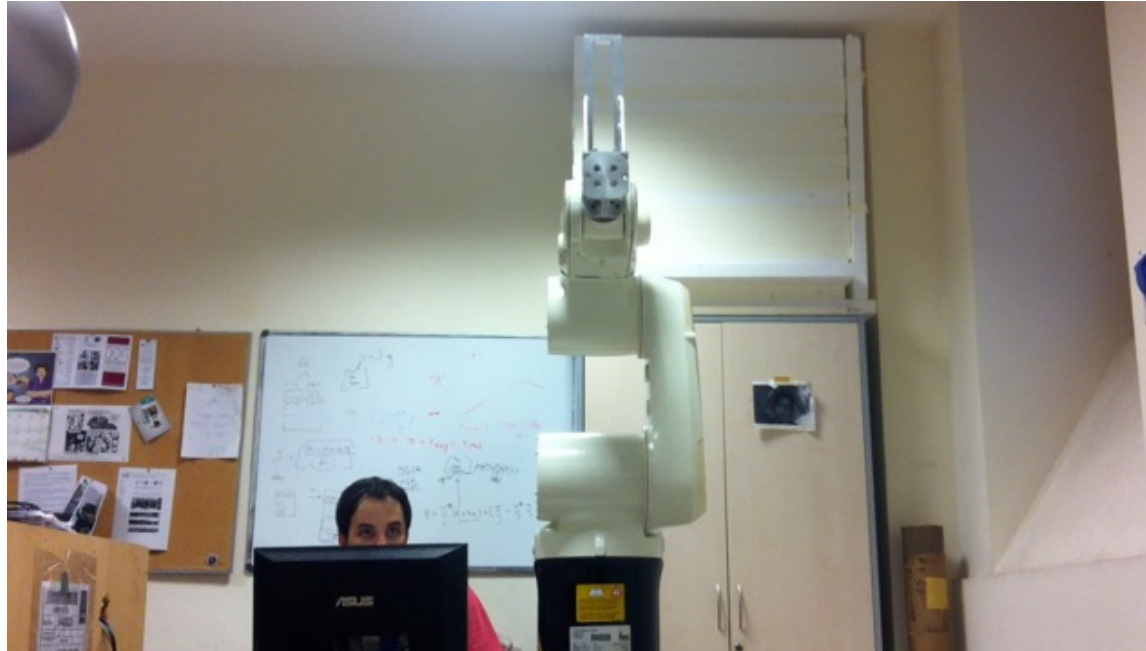
- the final configuration is **NOT** specified a priori





Axis-angle orientation trajectory

video



$$L = \|p_{\text{final}} - p_{\text{init}}\| = 0.763 \text{ [m]}$$

$$\omega = r\dot{\theta} \rightarrow \|\omega\| = |\dot{\theta}|$$

$$\dot{\omega} = r\ddot{\theta} \rightarrow \|\dot{\omega}\| = |\ddot{\theta}|$$

coordinated
Cartesian motion
with bounds

$$\begin{aligned} v_{\text{max}} &= 0.4 \text{ [m/s]} \\ a_{\text{max}} &= 0.1 \text{ [m/s}^2\text{]} \\ \omega_{\text{max}} &= \pi/4 \text{ [rad/s]} \\ \dot{\omega}_{\text{max}} &= \pi/8 \text{ [rad/s}^2\text{]} \end{aligned}$$



triangular
speed profile $\dot{s}(t)$
with minimum
time $T = 5.52 \text{ s}$

(imposed by the bounds
on **linear** motion)

$$\begin{aligned} p(s) &= p_{\text{init}} + s(p_{\text{final}} - p_{\text{init}}) \\ &= (0.540 \ 0 \ 1.515)^T + s(-0.540 \ 0.540 \ 0)^T, \quad s \in [0,1] \end{aligned}$$

$$\begin{aligned} R_{\text{init}} &= \begin{pmatrix} 0 & 0 & 1 \\ 0 & -1 & 0 \\ 1 & 0 & 0 \end{pmatrix} = R_{\text{init}}^T \\ R_{\text{final}} &= \begin{pmatrix} 1 & 0 & 0 \\ 0 & 0 & 1 \\ 0 & -1 & 0 \end{pmatrix} \end{aligned}$$

$$\begin{aligned} R_{\text{init}}^T R_{\text{final}} &= \begin{pmatrix} 0 & -1 & 0 \\ 0 & 0 & -1 \\ 1 & 0 & 0 \end{pmatrix} \\ &= \text{Rot}(r, \theta_{\text{if}}) \end{aligned}$$

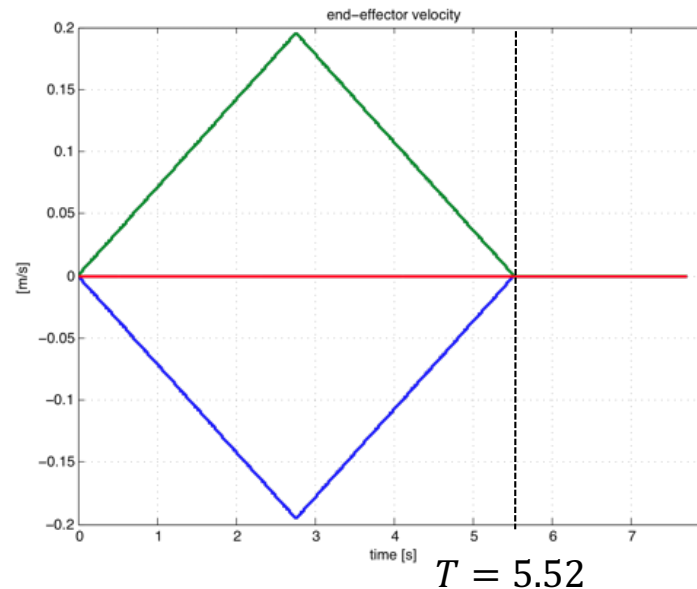
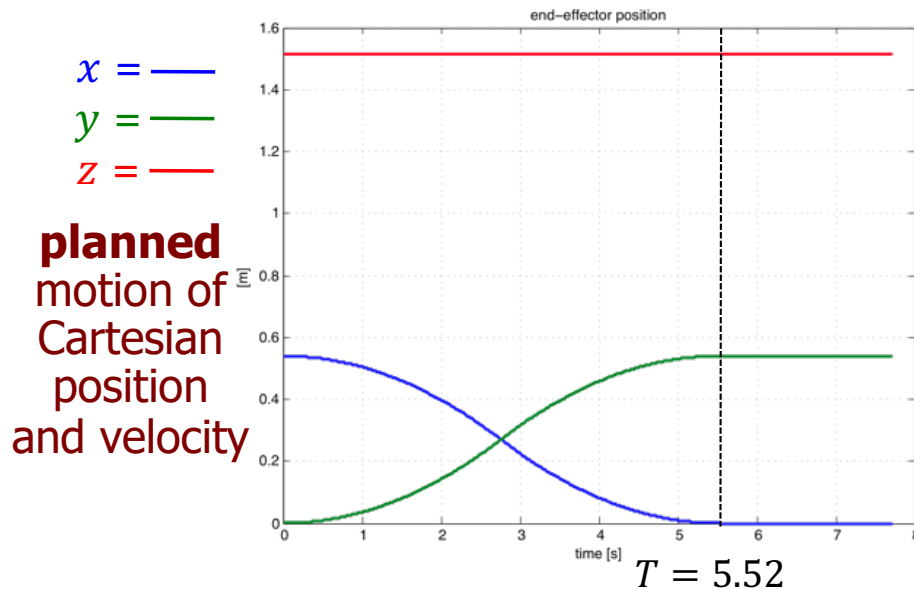
$$r = \frac{1}{\sqrt{3}} \begin{pmatrix} 1 \\ -1 \\ 1 \end{pmatrix}, \theta_{\text{if}} = \frac{2\pi}{3} \text{ [rad]} (= 120^\circ)$$

$$\begin{aligned} R(s) &= R_{\text{init}} \text{Rot}(r, \theta(s)) \\ \theta(s) &= s\theta_{\text{if}}, \quad s \in [0,1] \end{aligned}$$

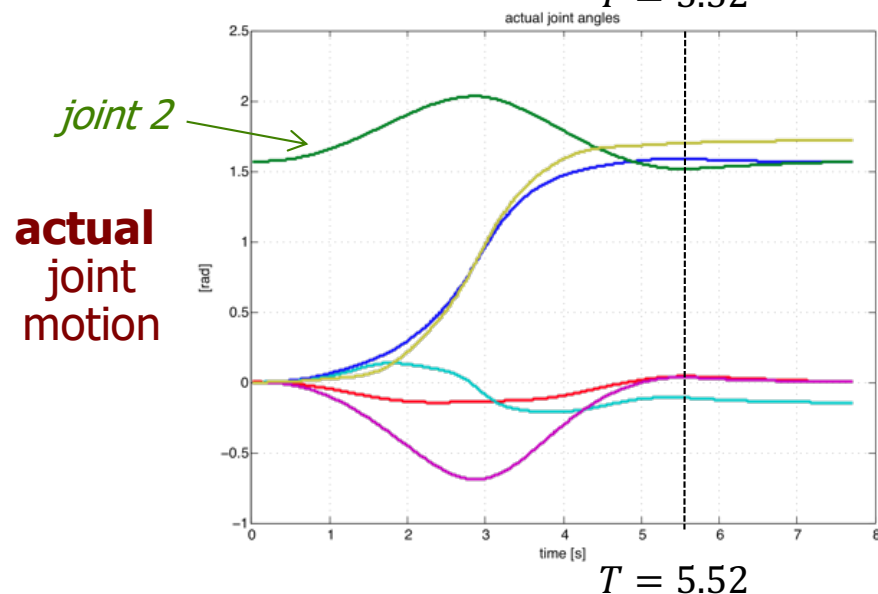
$$s = s(t), \quad t \in [0, T]$$



Axis-angle orientation trajectory



triangular
profile for
linear speed
 $T = 5.52$ s



- the robot joint velocity was commanded by inversion of the **geometric** Jacobian
- a **user** program, via KUKA RSI interface at $T_c = 12$ ms sampling time (two-way communication)
- robot motion execution is \approx what was planned, but only thanks to an external **kinematic control** loop (at **task** level)

Comparison of orientation trajectories

Euler angles vs. axis-angle method

- initial configuration $q(0) = (0 \quad \pi/2 \quad \pi/2 \quad 0 \quad -\pi/2 \quad 0)^T$
- initial** end-effector position $p(0) = (0.115 \quad 0 \quad 1.720)^T$
- initial** orientation

$$R(0) = \begin{pmatrix} 0 & 0 & 1 \\ 0 & -1 & 0 \\ 1 & 0 & 0 \end{pmatrix}$$

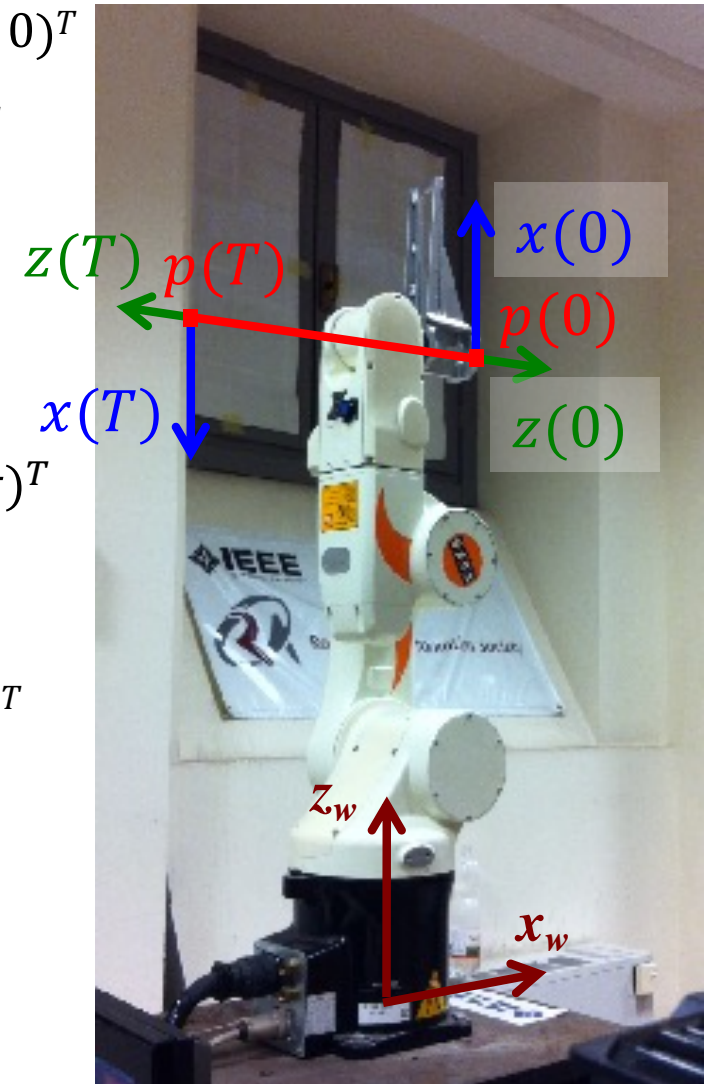
- initial** Euler ZYZ (α, β, γ) angles $\phi_{\text{ZYZ}}(0) = (0 \quad \pi/2 \quad \pi)^T$

↓ via a **linear path** (for position)

- final** end-effector position $p(T) = (-0.172 \quad 0 \quad 1.720)^T$
- final** orientation

$$R(T) = \begin{pmatrix} 0 & 0 & -1 \\ 0 & -1 & 0 \\ -1 & 0 & 0 \end{pmatrix}$$

- final** Euler ZYZ angles $\phi_{\text{ZYZ}}(T) = (-\pi \quad \pi/2 \quad 0)^T$





Comparison of orientation trajectories

Euler angles vs. axis-angle method

$$R_{\text{init}} = \begin{pmatrix} 0 & 0 & 1 \\ 0 & -1 & 0 \\ 1 & 0 & 0 \end{pmatrix}$$

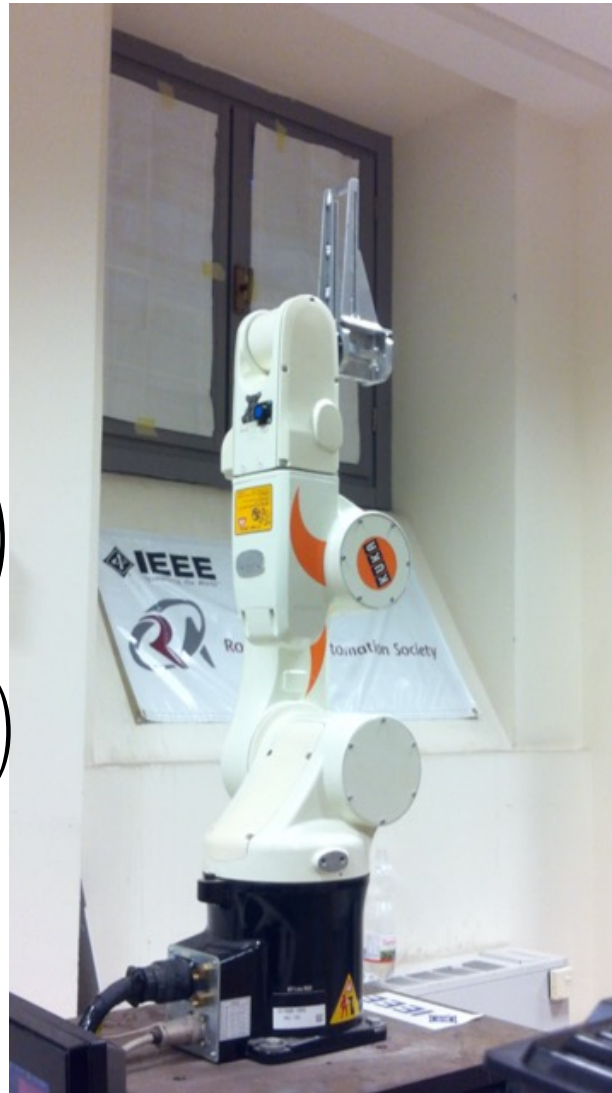
$$\Rightarrow \phi_{\text{ZYZ,init}} = \begin{pmatrix} 0 \\ \pi/2 \\ \pi \end{pmatrix}$$

$$R_{\text{final}} = -\begin{pmatrix} 0 & 0 & 1 \\ 0 & 1 & 0 \\ 1 & 0 & 0 \end{pmatrix}$$

$$\Rightarrow \phi_{\text{ZYZ,final}} = \begin{pmatrix} -\pi \\ \pi/2 \\ 0 \end{pmatrix}$$

(singularity at
 $\beta = 0$ avoided!)

video



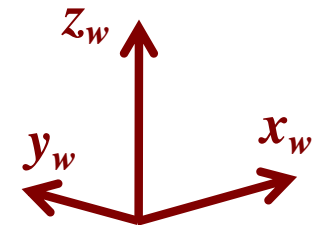
using ZYZ Euler angles



using axis-angle method

$$R_{\text{init}}^T R_{\text{final}} = \begin{pmatrix} -1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & -1 \end{pmatrix}$$

$$\Rightarrow r = \begin{pmatrix} 0 \\ -1 \\ 0 \end{pmatrix}, \quad \theta = \pi$$



video

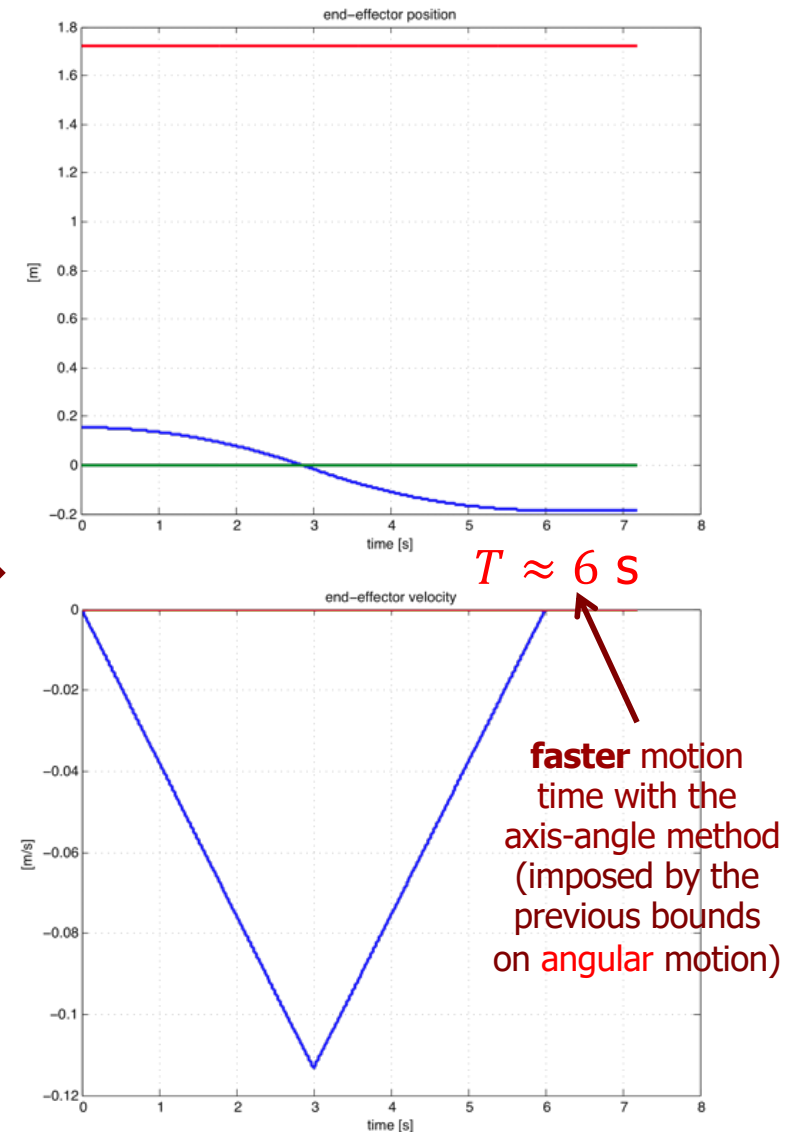
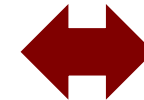
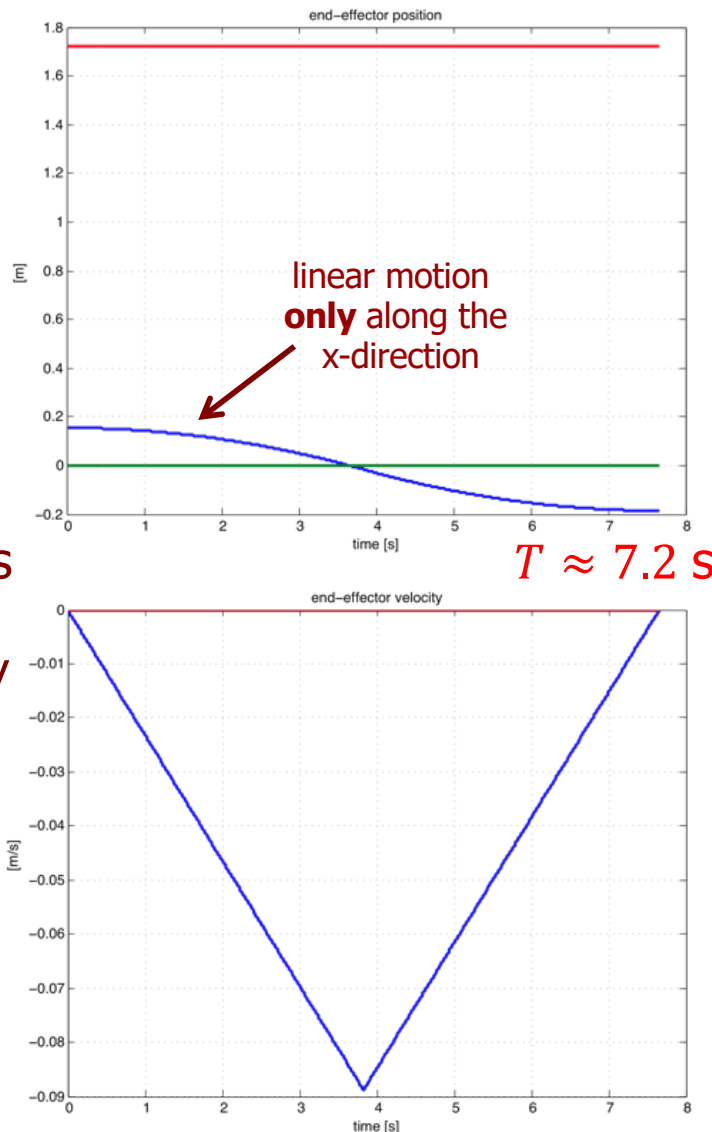


Comparison of orientation trajectories

Euler angles vs. axis-angle method

planned
Cartesian
components
of position
and velocity

$x =$ — (blue)
 $y =$ — (green)
 $z =$ — (red)



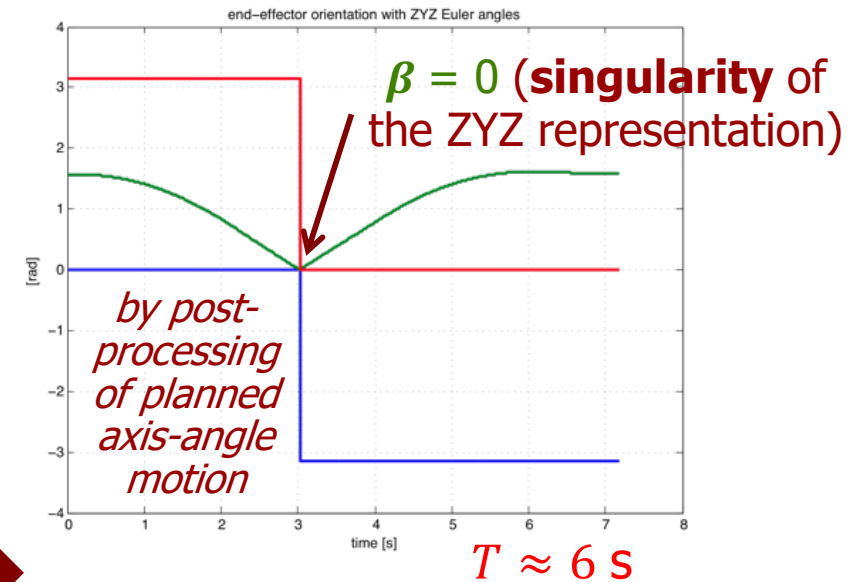
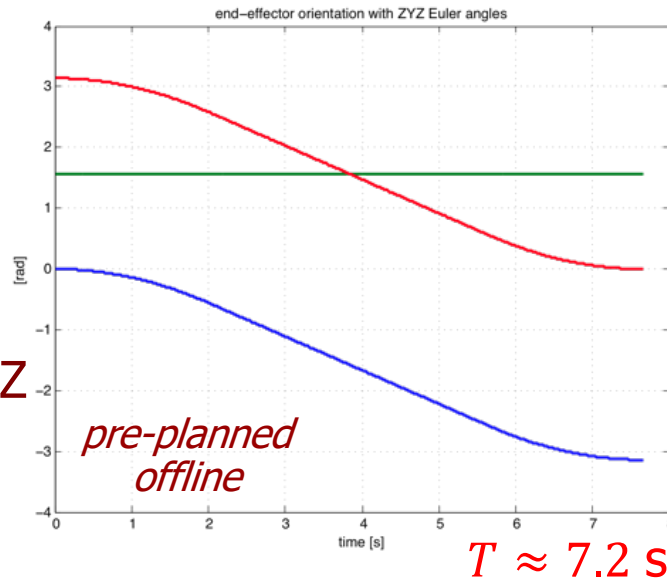


Comparison of orientation trajectories

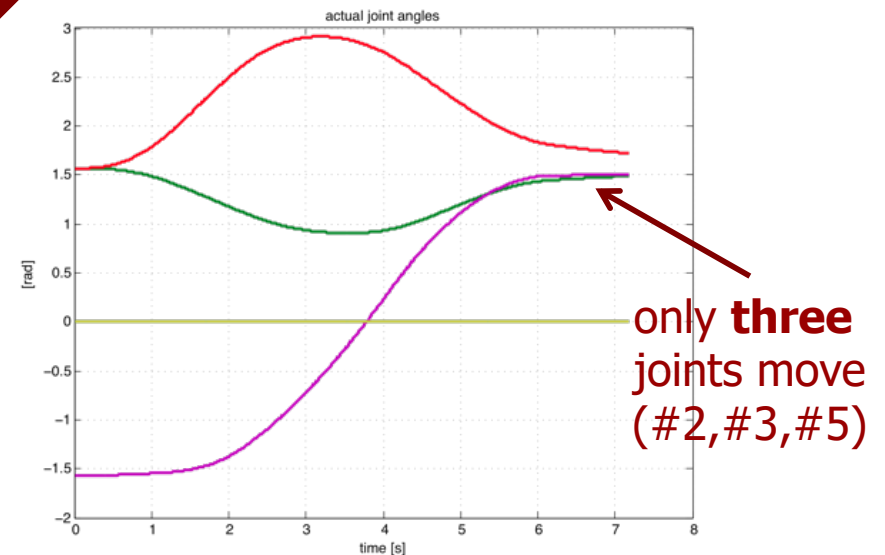
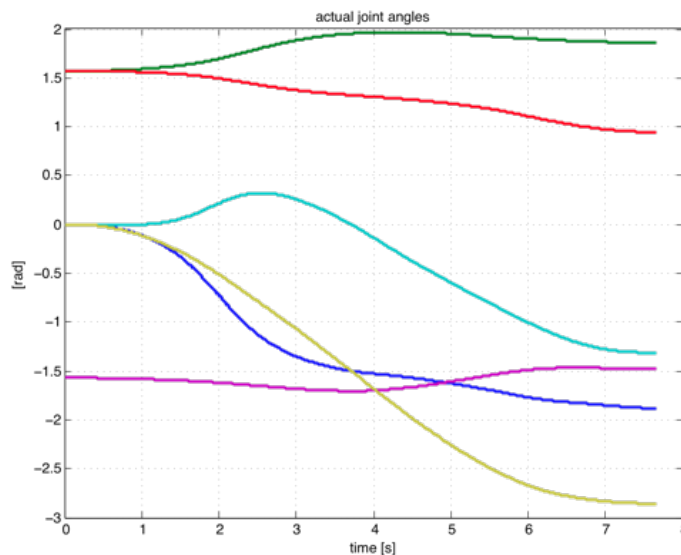
Euler angles vs. axis-angle method

$\alpha =$ — (blue)
 $\beta =$ — (green)
 $\gamma =$ — (red)

orientation
in terms of ZYZ
Euler angles



**actual
joint
motion**



using ZYZ Euler angles

using axis-angle method



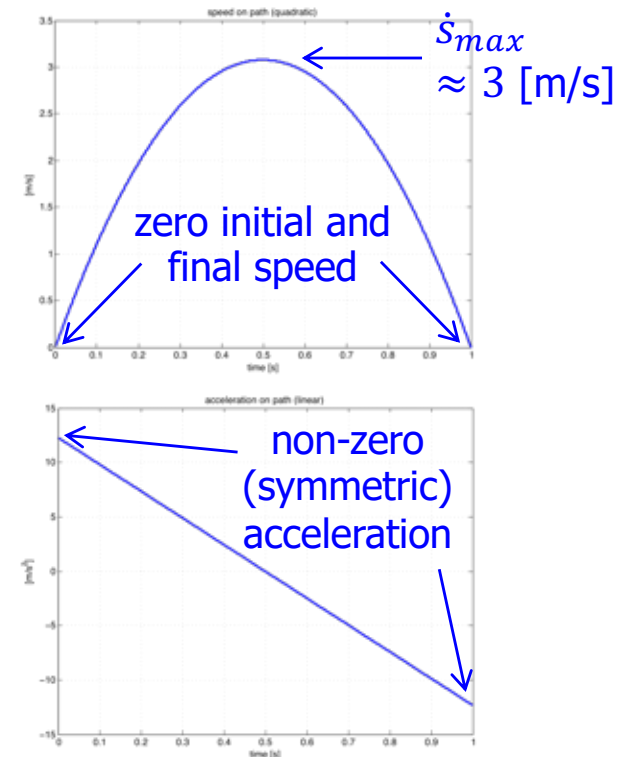
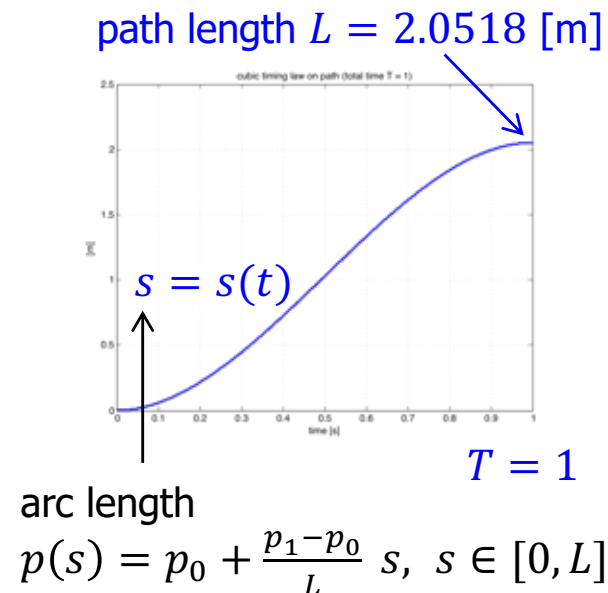
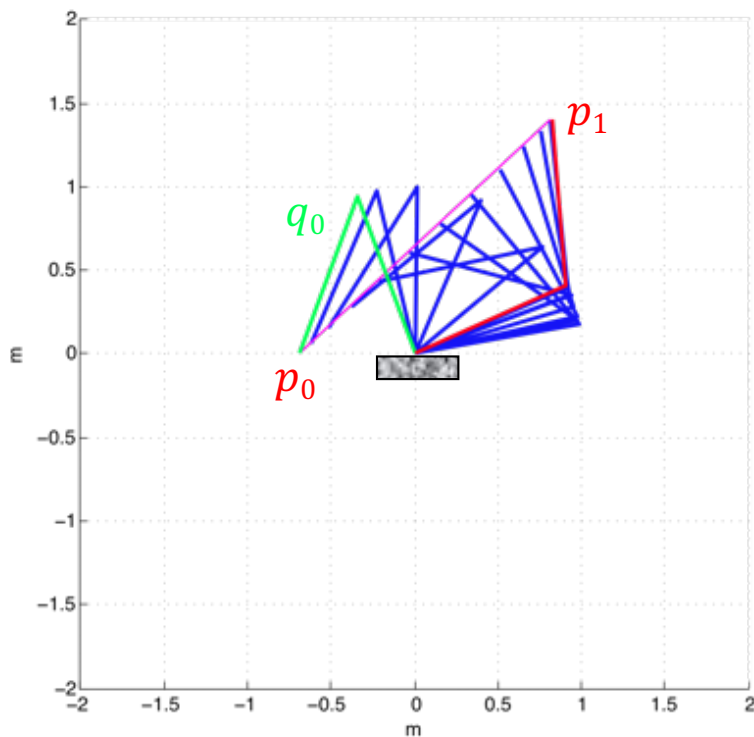
Uniform time scaling

- for a given path $p(s)$ (in joint or Cartesian space) and timing law $s(\tau)$ ($\tau = t/T$, T ="motion time"), we need to **check if existing bounds** v_{max} on (joint) velocity and/or a_{max} on (joint) acceleration **are violated or not**
 - ... unless such constraints have already been taken into account during the trajectory planning, e.g., by using a bang-coast-bang acceleration timing law
- **velocity scales linearly** with motion time
 - $dp/dt = (dp/ds)(ds/d\tau) \cdot 1/T$
- **acceleration scales quadratically** with motion time
 - $d^2p/dt^2 = ((d^2p/ds^2)(ds/d\tau)^2 + (dp/ds)(d^2s/d\tau^2)) \cdot 1/T^2$
- if motion is unfeasible, **scale** (**increase**) time $T \rightarrow kT$ ($k > 1$), based on the "most violated" constraint (max of the ratios $|v|/v_{max}$ and $|a|/a_{max}$)
- if motion is "too slow" w.r.t. the robot capabilities, **decrease** T ($k < 1$)
 - in both cases, after scaling, there will be (at least) one instant of saturation (for at least one variable)
 - **no need** to re-compute motion profiles from scratch!



Numerical example - 1

- 2R planar robot with links of unitary length (1 [m])
- linear Cartesian path $p(s)$: $q_0 = (110^\circ, 140^\circ) \Rightarrow p_0 = f(q_0) = (-0.684, 0) \Rightarrow p_1 = (0.816, 1.4)$ [m], with rest-to-rest cubic timing law $s(t)$, $T = 1$ [s]
- joint space bounds: max (absolute) velocity $v_{max,1} = 2, v_{max,2} = 2.5$ [rad/s], max (absolute) acceleration $a_{max,1} = 5, a_{max,2} = 7$ [rad/s²]

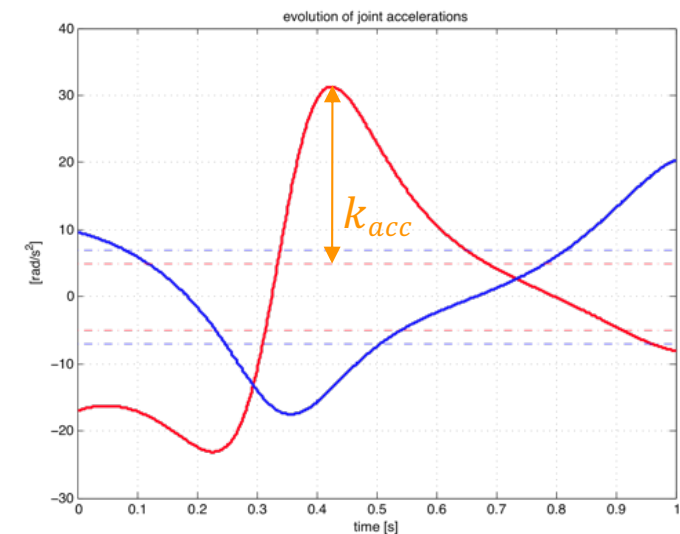
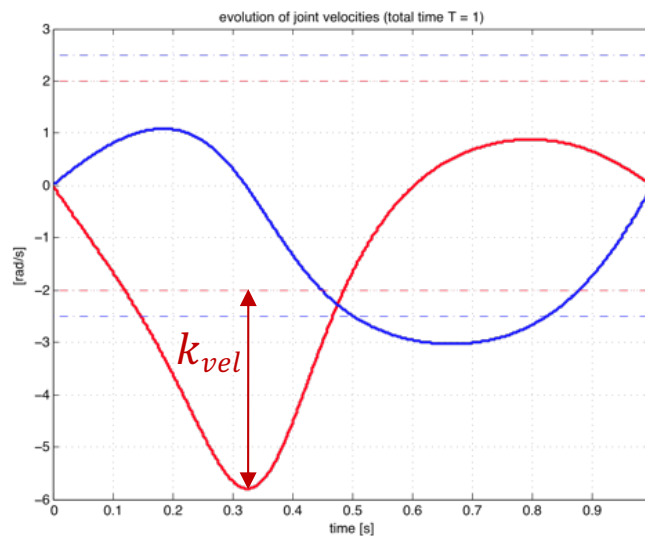
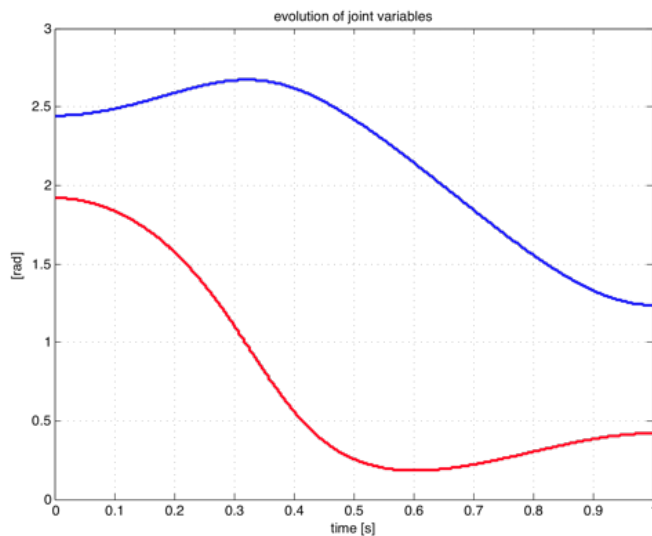




Numerical example - 2

- **violation** of both joint velocity and acceleration bounds with $T = 1$ [s]
 - max relative violation of joint **velocities**: $k_{vel} = 2.898 = \max \{1, |\dot{q}_1|/v_{max,1}, |\dot{q}_2|/v_{max,2}\}$
 - and of joint **accelerations**: $k_{acc} = 6.2567 = \max \{1, |\ddot{q}_1|/a_{max,1}, |\ddot{q}_2|/a_{max,2}\}$
- minimum **uniform time scaling** of Cartesian trajectory to **recover feasibility**

$$k = \max \{1, k_{vel}, \sqrt{k_{acc}}\} = 2.898 \Rightarrow T_{scaled} = kT = 2.898 > T$$



— = joint 1 — = joint 2

Numerical example - 3

- **scaled** trajectory with $T_{scaled} = 2.898$ [s]
 - speed [acceleration] on path and joint velocities [accelerations] scale linearly [quadratically]

