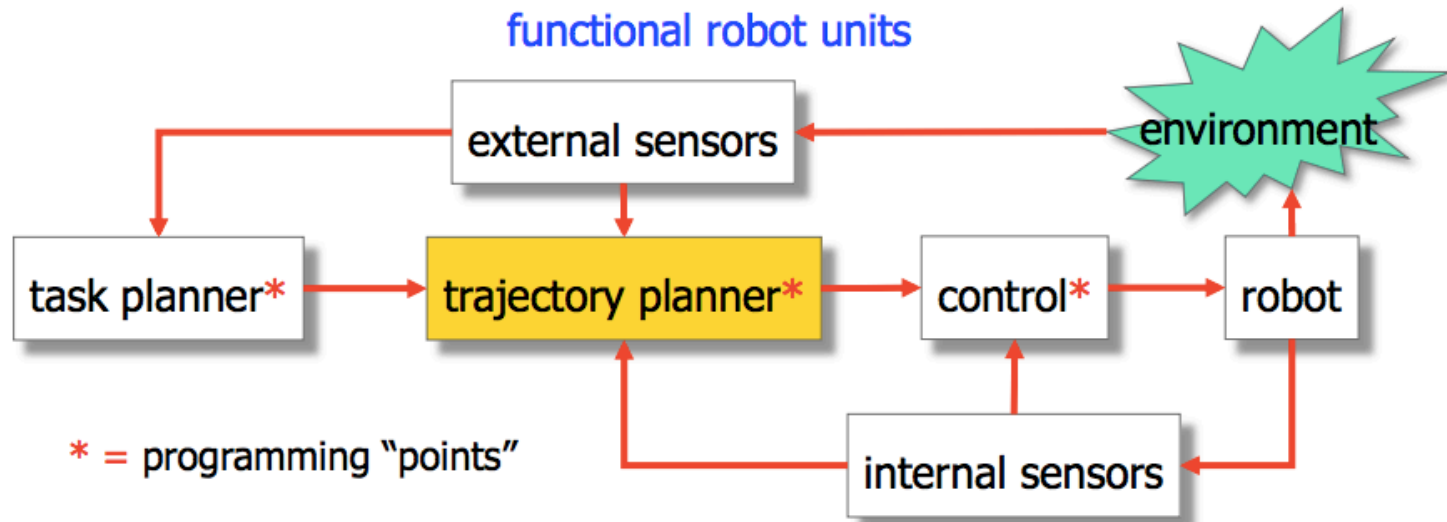


CMPUT 312  
Intro Robotics & Mechatronics:

# Trajectory Planning

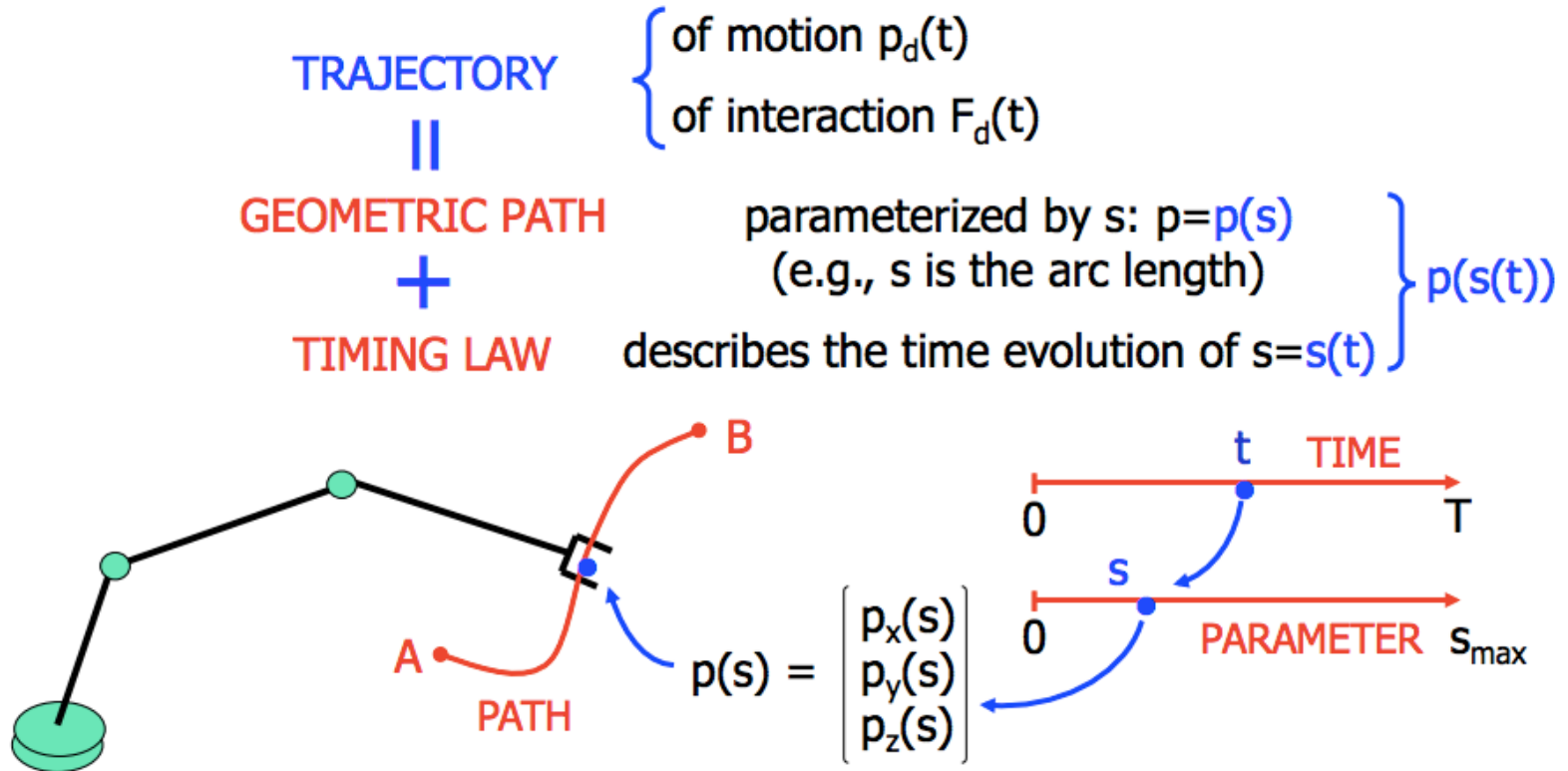
## Control

Slides from Prof. A. De Luca - lecture notes (Robotics 1)



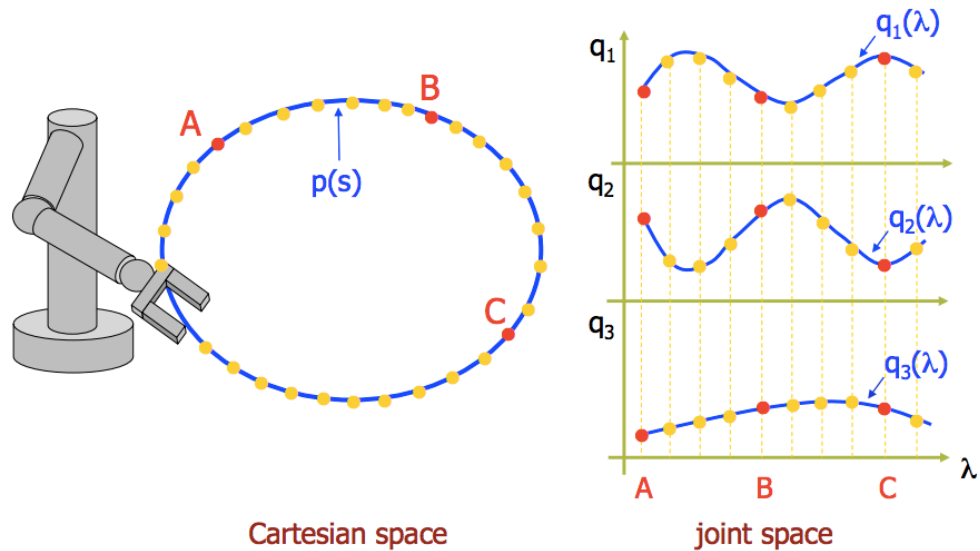
1. define Cartesian pose points (position+orientation) using the teach-box
2. program an (average) velocity between these points, as a 0-100% of a maximum system value (different for Cartesian- and joint-space motion)
3. linear interpolation in the joint space between points sampled from the built trajectory

# From Task to Trajectory



example: TASK planner provides A, B  
TRAJECTORY planner generates  $p(t)$

# Example



## TASK planning

- 1
  - sequence of pose points ("knots") in Cartesian space
  - interpolation in Cartesian space
  - Cartesian geometric path (position + orientation):  $p = p(s)$
- 2
  - path sampling and kinematic inversion
  - sequence of "knots" in joint space
  - interpolation in joint space
  - geometric path in joint space:  $q = q(\lambda)$

analytic  
inversion

# Cartesian vs. Joint Trajectory planning

## Joint space

- Easy to go through via points  
(Solve inverse kinematics at all path points and plan)
- No problems with singularities
- Less calculations
- Can not follow straight line

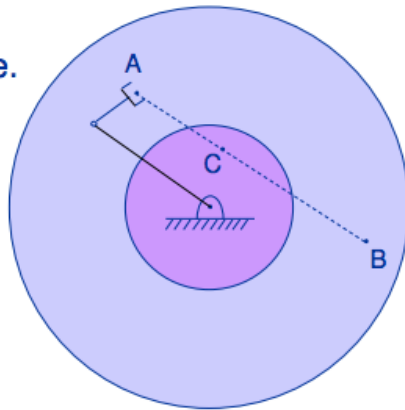
## Cartesian space

- We can track a shape  
(for orientation : equivalent axes, Euler angles,...)
- More expensive at run time  
(after the path is calculated need joint angles in a lot of points)
- Discontinuity problems

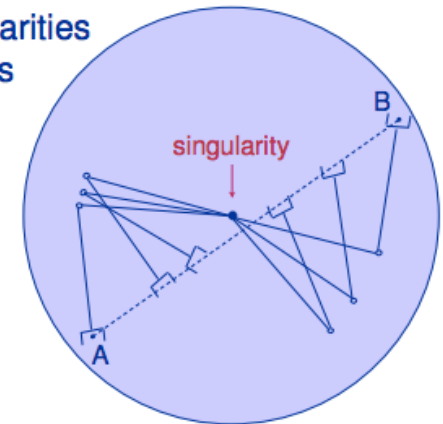
# Difficulties in Cartesian Space

Initial and Goal  
Points are reachable.

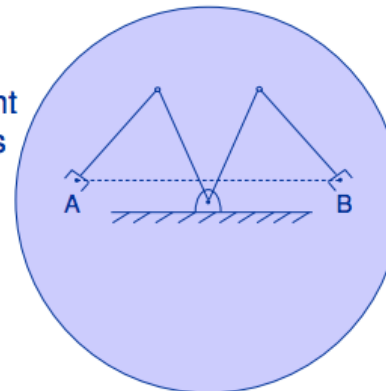
Intermediate points  
(C) unreachable.



Approaching singularities  
some joint velocities  
go to  $\infty$   
causing deviation  
from the path



Start point (A) and  
goal point (B) are  
reachable in different  
joint space solutions  
(The middle points  
are reachable from  
below.)



# Trajectory Planning in **any** space:

Assume one generic variable  $u$

(can be  $x, y, z$ , orientation -  $\alpha, \beta, \gamma$ )

joint variables

direction cosines

Candidate curves :

straight line (discontinuous velocity at path points)



straight line with blends

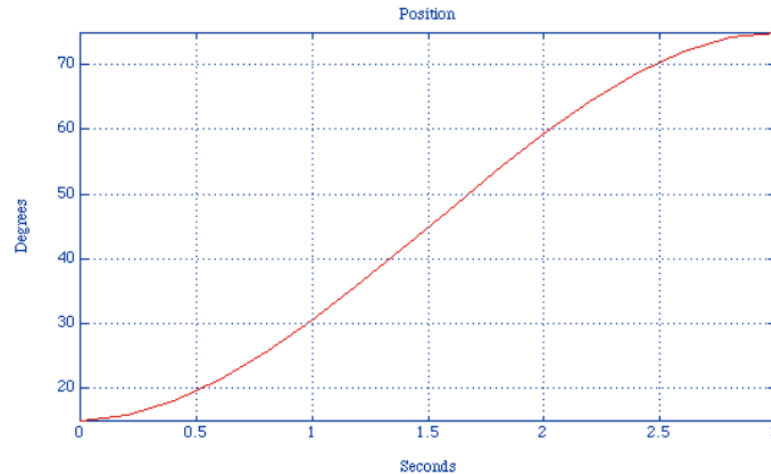


cubic polynomials (splines)



higher order polynomials (quintic,...) or other curves

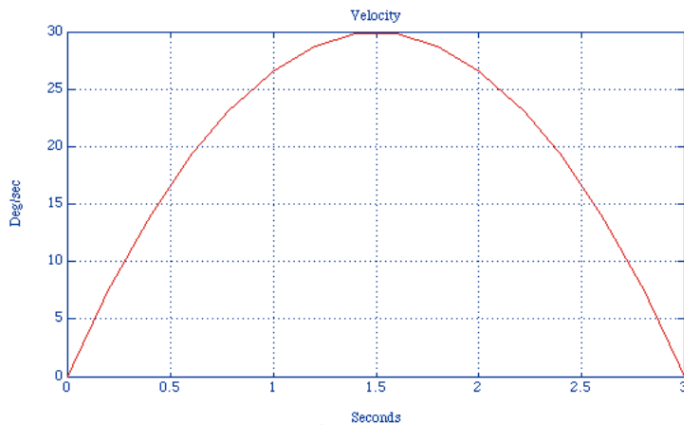
# Cubic Polynomial



$$u(t) = a_0 + a_1 t + a_2 t^2 + a_3 t^3$$

$$u(0) = u_0 ; u(t_f) = u_f$$

Initial  
Conditions:

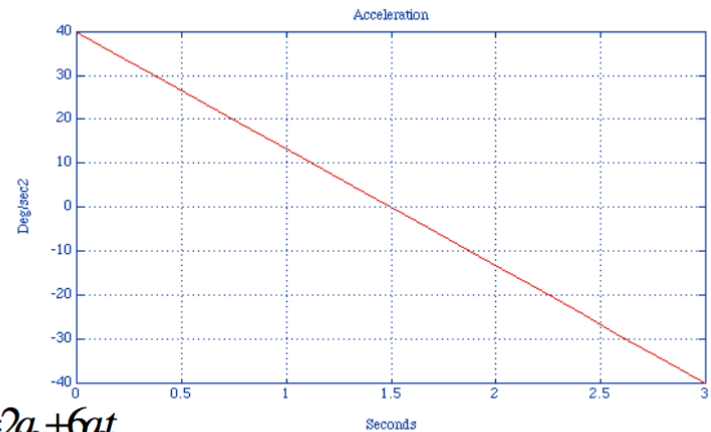


$$\dot{u}(t) = a_1 + 2a_2 t + 3a_3 t^2$$

$$\dot{u}(0) = 0 ; \dot{u}(t_f) = 0$$

Initial  
Conditions:

Starts and ends at rest



$$\ddot{u}(t) = 2a_2 + 6a_3 t$$

$$\ddot{u}(t) = 6a_3 \text{ (constant)}$$

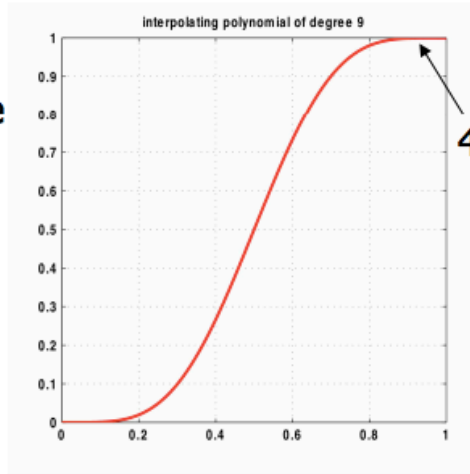
Solution :

$$u(t) = u_0 + \frac{3}{t_f^2} (u_f - u_0) t^2 + \left( -\frac{2}{t_f^3} \right) (u_f - u_0) t^3$$



- 3<sup>rd</sup> order >> still non-zero accelerations
- use higher order polynomials (5<sup>th</sup> , 7<sup>th</sup> , ...)

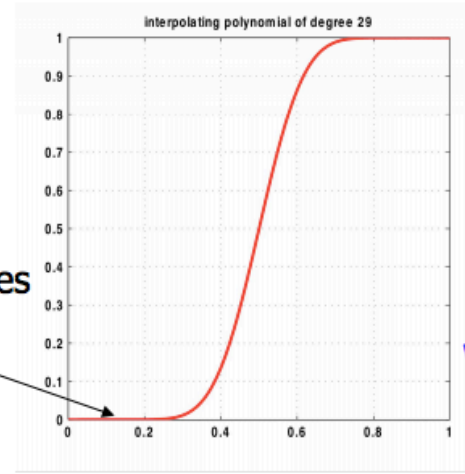
9th  
degree



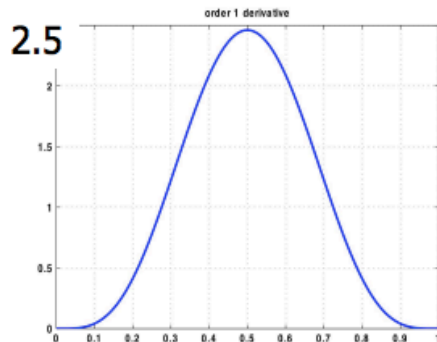
4 derivatives  
are zero

14 derivatives  
are zero!

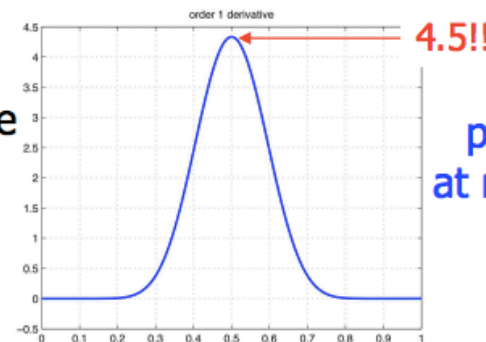
29th  
degree



no  
overshoot  
nor  
wandering



normalized  
first derivative  
(velocity  
in time)

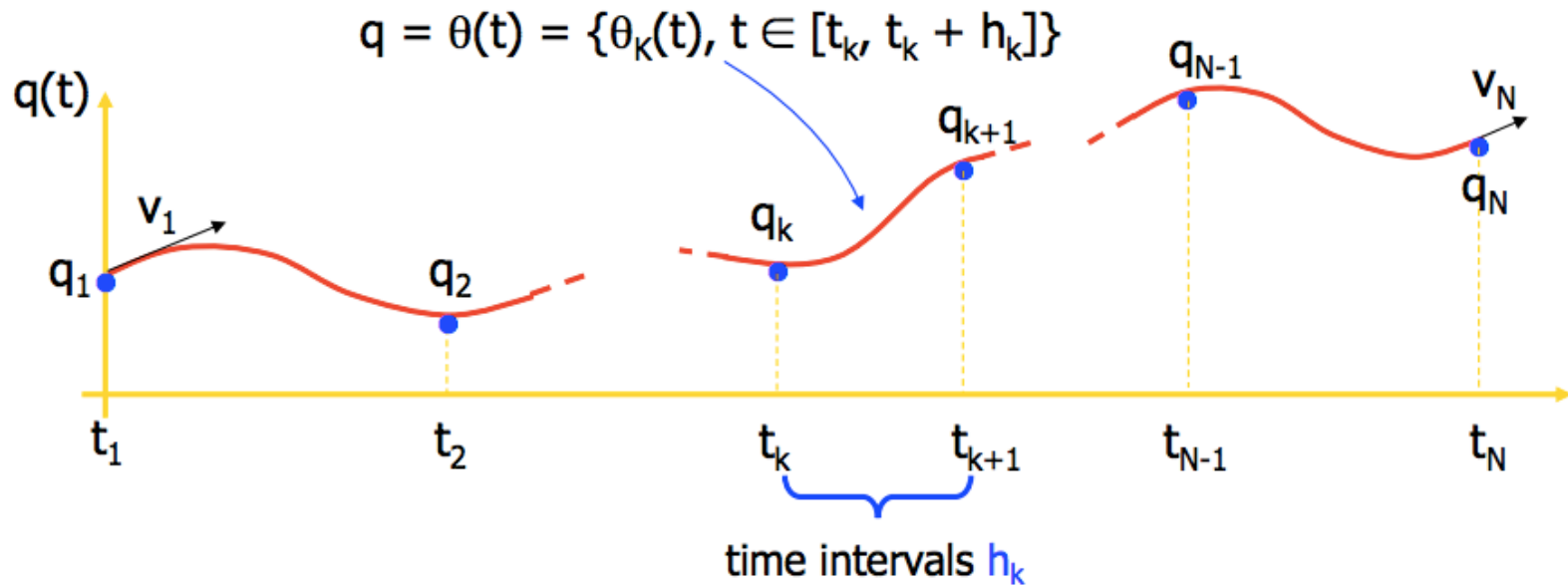


4.5!!  
peaking  
at midpoint

- higher order polynomials >> computationally more expensive
- hard to handle **N** way-points.
- oscillations arise out of the interpolation points (**wandering**)

# practical solution >> spline

**Problem:** interpolate N knots, with continuity up to the second derivative ?



## ■ solution

**spline:** N-1 cubic polynomials, concatenated so as to pass through N knots and being continuous up to the second derivative at the N-2 internal knots

$$\theta_k(\tau) = a_{k0} + a_{k1} \tau + a_{k2} \tau^2 + a_{k3} \tau^3 \quad \tau \in [0, h_k], \tau = t - t_k \quad (k = 1, \dots, N-1)$$

continuity conditions  
for velocity and acceleration



$$\begin{aligned} \dot{\theta}_k(h_k) &= \dot{\theta}_{k+1}(0) \\ \ddot{\theta}_k(h_k) &= \ddot{\theta}_{k+1}(0) \end{aligned} \quad k = 1, \dots, N-2$$

# Algorithmic Implementation

1. if all **velocities**  $v_k$  at **internal knots** were known, then each cubic in the spline would be uniquely determined by

$$\begin{aligned} \theta_K(0) &= q_K = a_{K0} \\ \dot{\theta}_K(0) &= v_K = a_{K1} \end{aligned} \quad \begin{pmatrix} h_K^2 & h_K^3 \\ 2h_K & 3h_K^2 \end{pmatrix} \begin{pmatrix} a_{K2} \\ a_{K3} \end{pmatrix} = \begin{pmatrix} q_{K+1} - q_K - v_K h_K \\ v_{K+1} - v_K \end{pmatrix} \quad (1)$$

2. impose the **continuity for accelerations** (N-2 conditions)

$$\ddot{\theta}_K(h_K) = 2 a_{K2} + 6 a_{K3} h_K = \ddot{\theta}_{K+1}(0) = 2 a_{K+1,2}$$

3. expressing the coefficients  $a_{K2}$ ,  $a_{K3}$ ,  $a_{K+1,2}$  in terms of the **still unknown** knot velocities (see step 1.) yields a linear system of equations that is always (easily) solvable

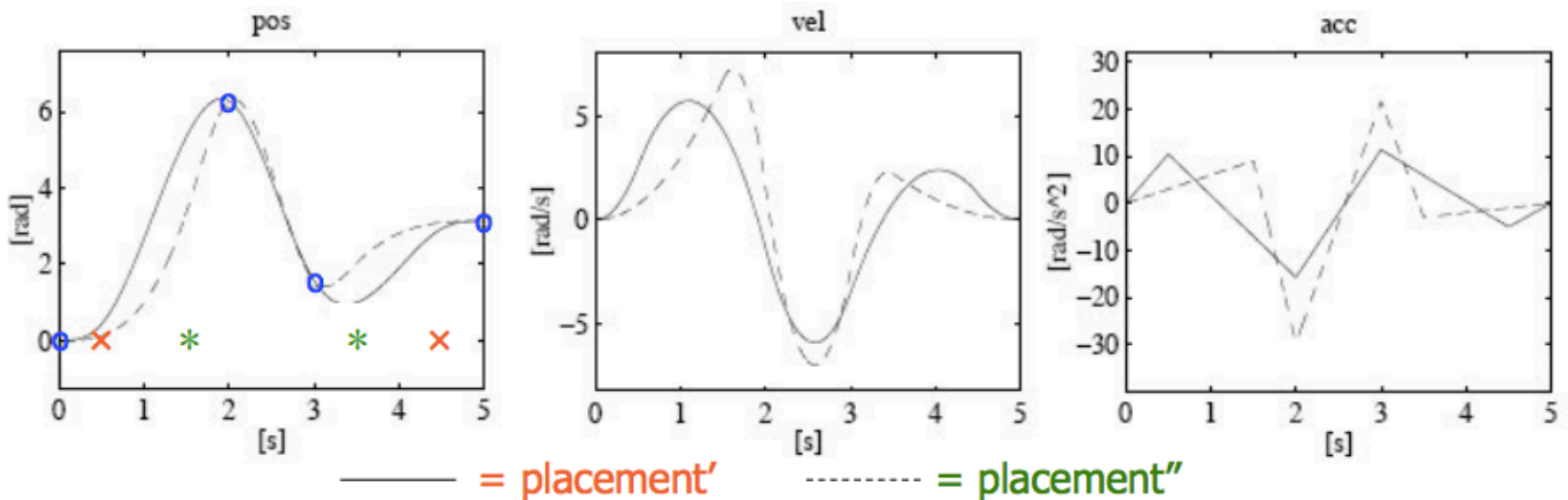
$$\begin{pmatrix} \text{tri-diagonal matrix} \\ \text{always invertible} \end{pmatrix} \begin{pmatrix} v_2 \\ v_3 \\ \vdots \\ v_{N-1} \end{pmatrix} = \begin{pmatrix} \text{known vector} \end{pmatrix} \quad \begin{matrix} \text{unknown} \\ \text{to be substituted then back in} \end{matrix} \quad (1)$$

$\uparrow$  tri-diagonal matrix always invertible       $\uparrow$  unknown       $\uparrow$  known vector



# Example

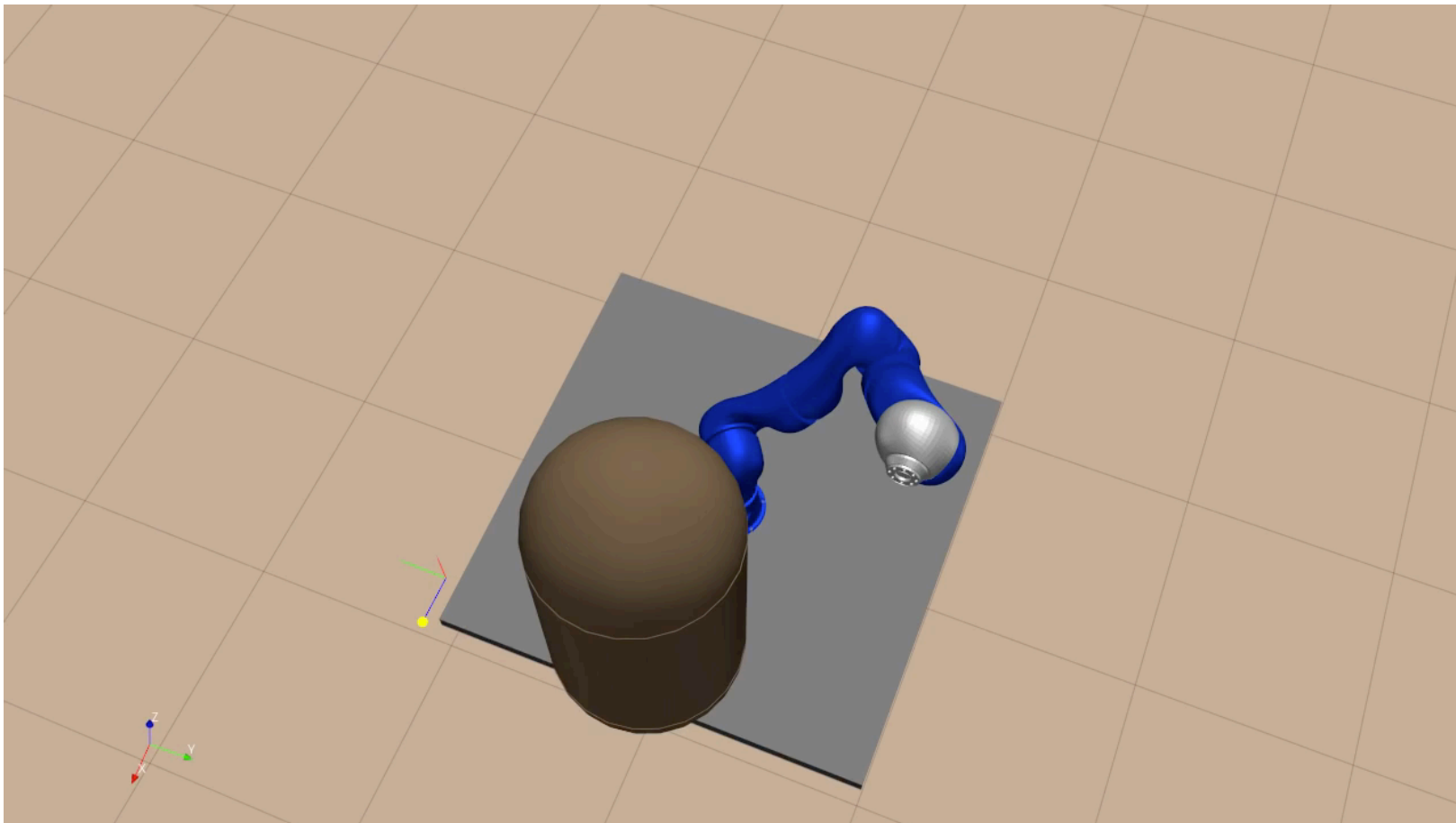
- **N = 4** knots (3 cubic polynomials)
  - joint values  $q_1 = 0, q_2 = 2\pi, q_3 = \pi/2, q_4 = \pi$
  - at  $t_1 = 0, t_2 = 2, t_3 = 3, t_4 = 5$  (thus,  $h_1 = 2, h_2 = 1, h_3 = 2$ )
  - boundary velocities  $v_1 = v_4 = 0$
- 2 added knots to **impose accelerations** at both ends (5 cubic polynomials)
  - boundary accelerations  $\alpha_1 = \alpha_4 = 0$
  - **two** placements: at  $t_1' = 0.5$  and  $t_4' = 4.5$  (✗), or  $t_1'' = 1.5$  and  $t_4'' = 3.5$  (\*)



# Trajectory Planning with Obstacles

- Path planning for the whole manipulator
  - Local vs. Global Motion Planning
    - Gross motion planning for relatively uncluttered environments
    - Fine motion planning for the end-effector frame
  - Configuration space (C-space) approach
- Planning for a point robot
  - graph representation of the free space, quadtree
  - Artificial Potential Field method
- Multiple robots, moving robots and/or obstacles

# Obstacle Avoidance



# Learning from demonstration

