



Universität Hamburg

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MIN Faculty  
Department of Informatics



# Introduction to Robotics

## Lecture 1

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University of Hamburg  
Faculty of Mathematics, Informatics and Natural Sciences  
Department of Informatics

Technical Aspects of Multimodal Systems

July 12, 2018

**Lecture:** Friday 10:00 c. t. - 12:00 c. t.  
**Room:** F-334  
**Web:** <http://tams.inf...burg.de/lectures/>

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**Consultation:** by arrangement

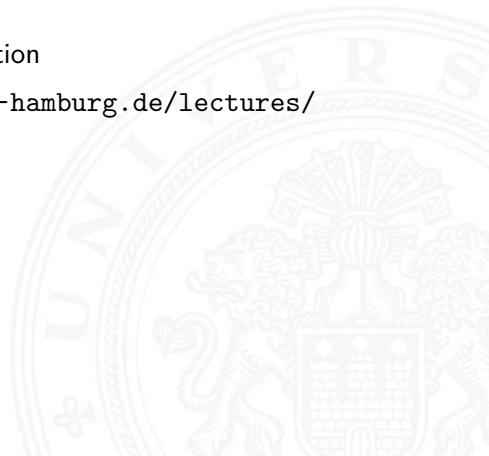
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<b>Exercises</b>	Friday 8:00 c. t. - 10:00 c. t. /
<b>/RPC:</b>	Friday 10:00 c. t. - 12:00 c. t. (alternating) see website for dates
<b>Room:</b>	F-334/F-304
<b>Web:</b>	<a href="http://tams.inf...burg.de/lectures/">http://tams.inf...burg.de/lectures/</a>
<b>Name:</b>	Lasse Einig
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<b>Consultation:</b>	by arrangement (eMail)



- ▶ See website for more information

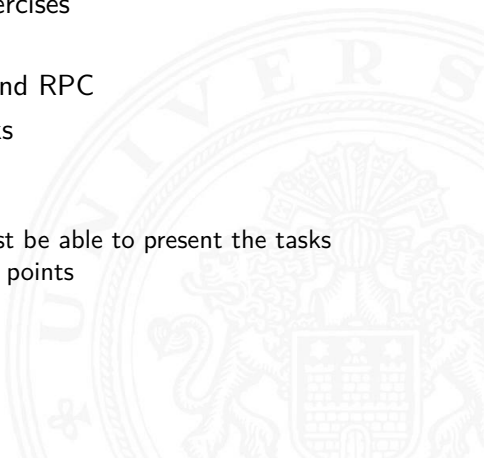
`http://tams.informatik.uni-hamburg.de/lectures/2019ss/vorlesung/itr`





## Criteria for Course Certificate:

- ▶ min. 50% of points in the exercises
  - ▶ min. 33% in each exercise
- ▶ regular presence in exercises and RPC
- ▶ presentation of two (sub-)tasks
- ▶ solutions in groups of 2–3
  - ▶ no solo submission
  - ▶ each member of a group must be able to present the tasks
  - ▶ failure to present results in 0 points



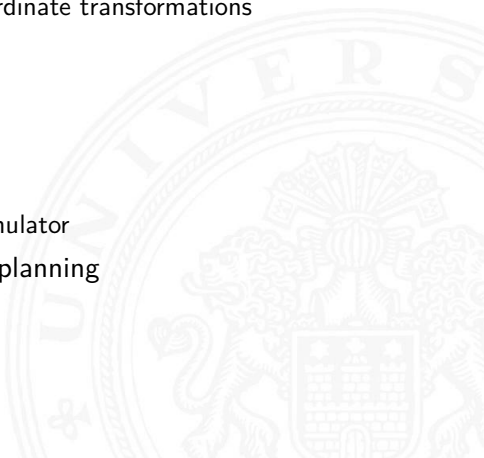
- ▶ Basics in physics
  - ▶ basics of electrical engineering
- ▶ Linear algebra
- ▶ Elementary algebra of matrices
- ▶ Related computer skills
  - ▶ git (RPC)
  - ▶ Linux (RPC)
  - ▶ access to mafiasi.de and pool computers
  - ▶ Python (RPC and Excercises)
  - ▶ Matlab (Excercises, recommended)

## Own Hardware

You may use your own laptop for the RPC (but not recommended). If you do, you require a Ubuntu 16.04 (Live or Virtual Machine) and fully installed `ros-kinetic-desktop-full`



- ▶ Mathematic concepts
  - ▶ description of space and coordinate transformations
  - ▶ kinematics
  - ▶ dynamics
- ▶ Control concepts
  - ▶ movement execution
- ▶ Programming aspects
  - ▶ ROS, URDF, Kinematics Simulator
- ▶ Task-oriented movement and planning



## Introduction

- Basic terms

- Robot Classification

## Coordinate systems

## Kinematic Equations

## Robot Description

## Inverse Kinematics for Manipulators

## Differential motion with homogeneous transformations

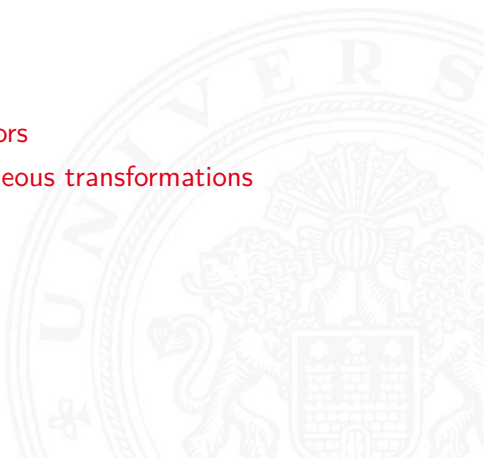
## Jacobian

## Trajectory planning

## Trajectory generation

## Dynamics

## Principles of Walking







# Outline (cont.)

Introduction

Introduction to Robotics

Robot Control

Task-Level Programming and Trajectory Generation

Task-level Programming and Path Planning

Task-level Programming and Path Planning

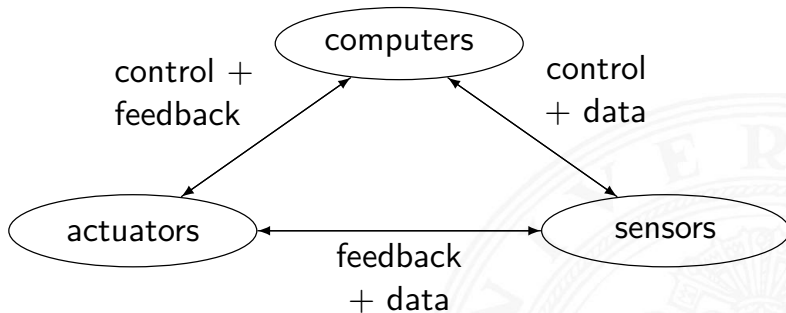
Architectures of Sensor-based Intelligent Systems

Summary

Conclusion and Outlook



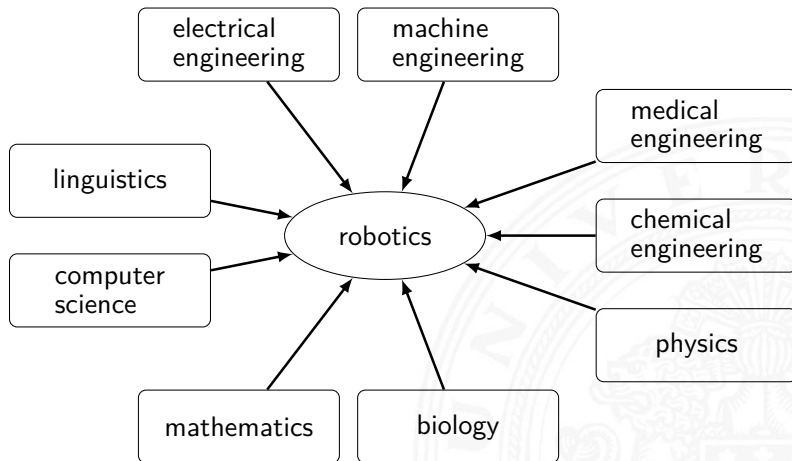
# Components of a robot



## Robotics

Intelligent combination of computers, sensors and actuators.

# An Interdisciplinary Field



According to RIA<sup>1</sup>, a robot is:

*...a reprogrammable and multifunctional manipulator, devised for the transport of materials, parts, tools or specialized systems, with varied and programmed movements, with the aim of carrying out varied tasks.*

## Intelligent System

Is such a robot also an intelligent system?

---

<sup>1</sup>Robot Institute of America



**Robot** became popular through a stage play by Karel Čapek in 1923, being a capable servant.

**Robotics** was invented by Isaac Asimov in 1942.

**Autonomous** (literally) (gr.) "living by one's own laws"  
(*Auto*: Self; *nomos*: Law)

**Personal Robot** a small, mobile robot system with simple skills regarding vision system, speech, movement, etc. (from 1980).

**Service Robot** a mobile handling system featuring sensors for sophisticated operations in service areas (from 1989).

**Intelligent Robot, Cognitive Robot, Intelligent System ...**

# Degree of Freedom (DOF)

The number of independent coordinate planes or orientations on which a joint or end-point of a robot can move.

The DOF are determined by the number of independent variables of the control system.

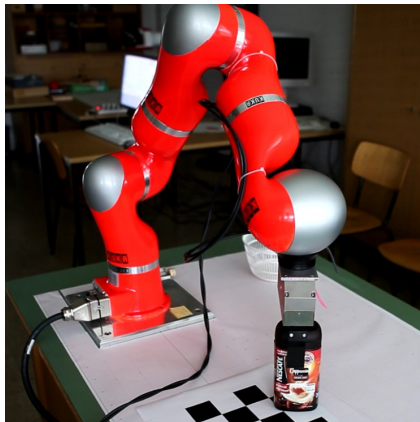
- ▶ Point on a line
- ▶ Point on a plane
- ▶ Point in space
- ▶ Rigid body
  - ▶ on a surface
  - ▶ on a plane
  - ▶ in space
- ▶ Non-rigid body
- ▶ Manipulator
  - ▶ number of independently controllable joints
  - ▶ a robot should have at least two

# DOF Examples



80's toy robot (Quickshot)  
4-DOF + 1-DOF gripper

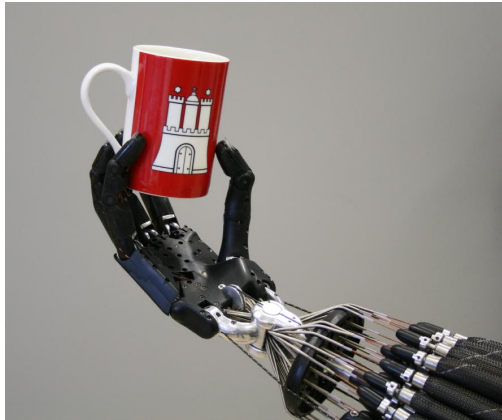
# DOF Examples (cont.)



KUKA LWR 4+ arm with Schunk gripper  
7-DOF + 1-DOF gripper



# DOF Examples (cont.)



Shadow C5 Air Muscle hand  
20-DOF + 4 unactuated joints

# DOF Examples (cont.)



Boston Dynamics Atlas (2013)

28-DOF

# DOF Examples (cont.)



PR2 service robot with Shadow C6 electrical hand  
19-DOF + 20-DOF gripper



by input power source

- ▶ electrical
- ▶ hydraulic
- ▶ pneumatic



by field of work

- ▶ stationary
  - ▶ arms with 2 DOF
  - ▶ arms with 3 DOF
  - ▶ ...
  - ▶ arms with 6 DOF
  - ▶ redundant arms ( $> 6$  DOF)
  - ▶ multi-finger hand
- ▶ mobile
  - ▶ automated guided vehicles
  - ▶ portal robot
  - ▶ mobile platform
  - ▶ running machines and flying robots
  - ▶ anthropomorphic robots (humanoids)



# Robot Classification (cont.)

by type of joint

- ▶ translatory
  - ▶ linear
  - ▶ prismatic
- ▶ rotatory
  - ▶ revolute
- ▶ combinations
  - ▶ ball
  - ▶ cylindrical
  - ▶ polar
  - ▶ cartesian

by robot coordinate system

- ▶ cartesian
- ▶ cylindrical
- ▶ spherical / polar
- ▶ SCARA
- ▶ joint-arm



by usage

- ▶ object manipulation
- ▶ object modification
- ▶ object processing
- ▶ transport
- ▶ assembly
- ▶ quality testing
- ▶ deployment in non-accessible areas
- ▶ agriculture and forestry
- ▶ underwater
- ▶ building industry
- ▶ service robot in medicine, housework, ...

# Robot Classification (cont.)

by intelligence

- ▶ manual control
- ▶ programmable for repeated movements
- ▶ featuring cognitive ability and responsiveness
- ▶ adaptive on task level



- ▶ robots move — computers don't
- ▶ interdisciplinarity
  - ▶ soft- and hardware technology
  - ▶ sensor technology
  - ▶ mechatronics
  - ▶ control engineering
  - ▶ multimedia, ...
- ▶ A dream of mankind:  
*Computers are the most ingenious  
product of human laziness to date.*

computers  $\Rightarrow$  robots

Slides and literature references @

<http://tams.informatik.uni-hamburg.de/lectures/>

- ▶ K. Fu, R. González, and C. Lee, *Robotics: Control, Sensing, Vision, and Intelligence*. McGraw-Hill series in CAD/CAM robotics and computer vision, McGraw-Hill, 1987
- ▶ R. Paul, *Robot Manipulators: Mathematics, Programming, and Control: the Computer Control of Robot Manipulators*. Artificial Intelligence Series, MIT Press, 1981
- ▶ J. Craig, *Introduction to Robotics: Pearson New International Edition: Mechanics and Control*. Always learning, Pearson Education, Limited, 2013

## Introduction

## Coordinate systems

- Concatenation of rotation matrices

- Inverse transformation

- Transformation equation

- Summary of homogeneous transformations

- Outlook

## Kinematic Equations

## Robot Description

## Inverse Kinematics for Manipulators

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# Outline (cont.)

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Dynamics

Principles of Walking

Robot Control

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Task-level Programming and Path Planning

Task-level Programming and Path Planning

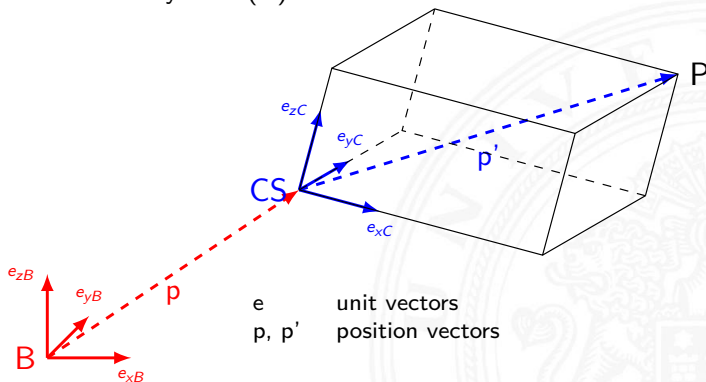
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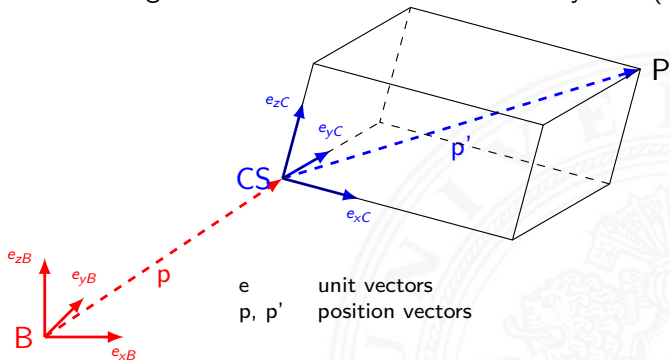
The **pose** of objects, in other words their **location** and **orientation** in Euclidian space can be described through specification of a cartesian coordinate system (**CS**) in relation to a base coordinate system (**B**).



# Specification of location and orientation

Position (object coordinates):

- ▶ translation along the axes of the base coordinate system (**B**)

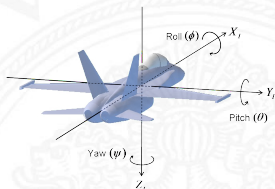
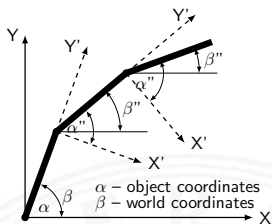


- ▶ given by  $\mathbf{p} = [p_x, p_y, p_z]^T \in \mathcal{R}^3$

# Specification of location and orientation (cont.)

## Orientation (in space):

- ▶ Euler-angles  $\varphi, \theta, \psi$ 
  - ▶ rotations are performed successively around the axes, e. g.  $ZY'X''$  or  $ZX'Z''$  (12 possibilities!)
  - ▶ order depends on reference coordinates
  - ▶ object (right), world (left)
  - ▶ Gimbal lock!
- ▶ Roll-Pitch-Yaw
  - ▶ specific case of Euler-angles (used in aviation and maritime)
  - ▶ rotation with respect to **object** axes (x – Roll, y – Pitch, z – Yaw)
- ▶ given by Rotation-matrix  $R \in \mathcal{R}^{3 \times 3}$ 
  - ▶ redundant; 9 parameters for 3 DOF



$$R = \begin{bmatrix} r_{11} & r_{21} & r_{31} \\ r_{12} & r_{22} & r_{32} \\ r_{13} & r_{23} & r_{33} \end{bmatrix}$$

# Specification of location and orientation (cont.)

▶ **Position:**

- ▶ given through  $\vec{p} \in \mathcal{R}^3$

▶ **Orientation:**

- ▶ given through projection  $\vec{n}, \vec{o}, \vec{a} \in \mathcal{R}^3$  of the axes of the CS to the origin system
- ▶ summarized to rotation matrix  $R = \begin{bmatrix} \vec{n} & \vec{o} & \vec{a} \end{bmatrix} \in \mathcal{R}^{3 \times 3}$
- ▶ redundant, since there are 9 parameters for 3 degrees of freedom
- ▶ other kinds of representation possible, e.g. *roll, pitch, yaw* angle, quaternions etc.

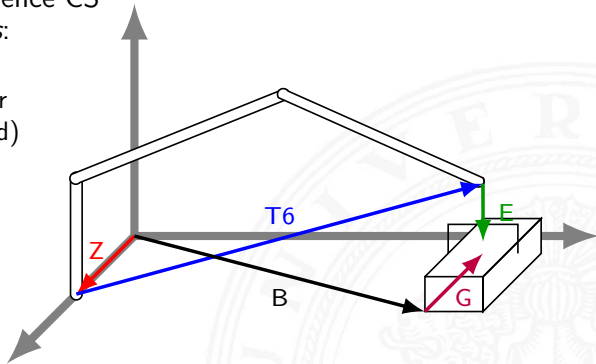


► Transform of Coordinate systems:

frame: a reference CS

*typical frames:*

- robot base
- end-effector
- table (world)
- object
- camera
- screen
- ...



Frame-transformations transform one frame into another.

${}^A T_B$  transforms frame  $A$  to frame  $B$  (Latex:  $\hat{\sim}\{A\}T_{\{B\}}\hat{\sim}$ )

- ▶ Combination of  $\vec{p}$  and  $R$  to  $T = \begin{bmatrix} R & \vec{p} \\ \vec{0} & 1 \end{bmatrix} \in \mathcal{R}^{4 \times 4}$
- ▶ Concatenation of several  $T$  through matrix multiplication
  - ▶  ${}^A T_B {}^B T_C = {}^A T_C$
- ▶ not commutative, in other words  ${}^B T_C {}^A T_B \neq {}^A T_B {}^B T_C$

# Homogenous transformation (cont.)

- ▶ Homogeneous transformation matrices:

$$T = \begin{bmatrix} R & \vec{p} \\ P & S \end{bmatrix}$$

where  $P$  depicts the perspective transformation and  $S$  the scaling.

- ▶ In robotics,  $P = \begin{bmatrix} 0 & 0 & 0 \end{bmatrix}$  and  $S = 1$ . Other values are used for computer graphics.



A translation with a vector  $[p_x, p_y, p_z]^T$  is expressed through a transformation  $H$ :

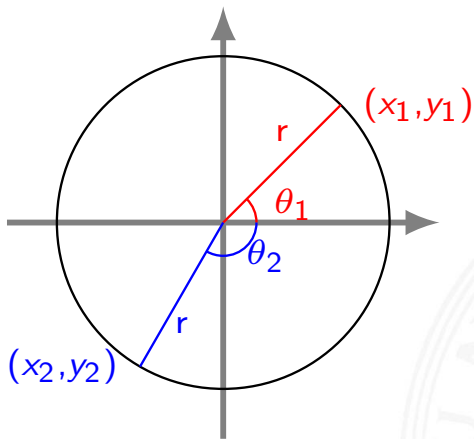
$$H = T_{(p_x, p_y, p_z)} = \begin{bmatrix} 1 & 0 & 0 & p_x \\ 0 & 1 & 0 & p_y \\ 0 & 0 & 1 & p_z \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

(shortened representation:  $S$  : sin,  $C$  : cos)

The transformation corresponding to a rotation around the x-axis with angle  $\varphi$  (*phi*):

$$R_{x,\varphi} = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & C\varphi & -S\varphi & 0 \\ 0 & S\varphi & C\varphi & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

# Rotatory transformation (cont.)



Coordinates of a circle

$$x = r \sin \theta, y = r \cos \theta$$

# Rotatory transformation (cont.)

The transformation corresponding to a rotation around the  $y$ -axis with angle  $\theta$  (*theta*):

$$R_{y,\theta} = \begin{bmatrix} C\theta & 0 & S\theta & 0 \\ 0 & 1 & 0 & 0 \\ -S\theta & 0 & C\theta & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

# Rotatory transformation (cont.)

The transformation corresponding to a rotation around the z-axis with angle  $\psi$  (*psi*):

$$R_{z,\psi} = \begin{bmatrix} C\psi & -S\psi & 0 & 0 \\ S\psi & C\psi & 0 & 0 \\ 0 & 0 & \mathbf{1} & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$



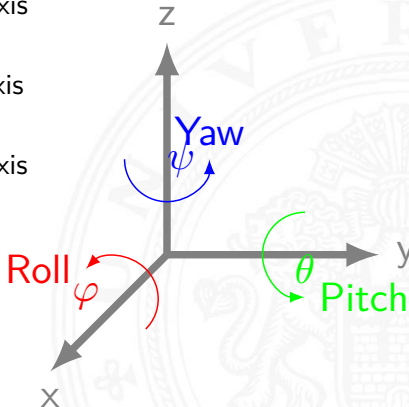
# Rotatory transformation (cont.)

Signs of transformations:

$$R = \begin{bmatrix} + & - & + & 0 \\ + & + & - & 0 \\ - & + & + & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

Sequential multiplication of the transformation matrices by order of rotation.

1. rotation  $\varphi$  around the  $x$ -axis  
 $R_{x,\varphi}$  – Roll
2. rotation  $\theta$  around the  $y$ -axis  
 $R_{y,\theta}$  – Pitch
3. rotation  $\psi$  around the  $z$ -axis  
 $R_{z,\psi}$  – Yaw



# Concatenation of rotation matrices

$$\begin{aligned} R_{\psi,\theta,\varphi} &= R_{z,\psi} R_{y,\theta} R_{x,\varphi} \\ &= \begin{bmatrix} C\psi & -S\psi & 0 & 0 \\ S\psi & C\psi & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} C\theta & 0 & S\theta & 0 \\ 0 & 1 & 0 & 0 \\ -S\theta & 0 & C\theta & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & C\varphi & -S\varphi & 0 \\ 0 & S\varphi & C\varphi & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \\ &= \begin{bmatrix} C\psi C\theta & C\psi S\theta S\varphi - S\psi C\varphi & C\psi S\theta C\varphi + S\psi S\varphi & 0 \\ S\psi C\theta & S\psi S\theta S\varphi + C\psi C\varphi & S\psi S\theta C\varphi - C\psi S\varphi & 0 \\ -S\theta & C\theta S\varphi & C\theta C\varphi & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \end{aligned}$$

*Remark:* Matrix multiplication is not commutative:

$$AB \neq BA$$

They are represented as four vectors using the elements of homogeneous transformation.

$$H = \begin{bmatrix} \mathbf{r}_1 & \mathbf{r}_2 & \mathbf{r}_3 & \mathbf{p} \\ 0 & 0 & 0 & 1 \end{bmatrix} = \begin{bmatrix} r_{11} & r_{21} & r_{31} & p_x \\ r_{12} & r_{22} & r_{32} & p_y \\ r_{13} & r_{23} & r_{33} & p_z \\ 0 & 0 & 0 & 1 \end{bmatrix} \quad (1)$$

The inverse of a rotation matrix is simply its transpose:

$$R^{-1} = R^T \text{ and } RR^T = I$$

whereas  $I$  is the identity matrix.

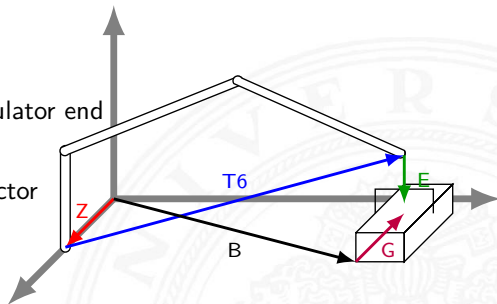
The inverse of (1) is:

$$H^{-1} = \begin{bmatrix} r_{11} & r_{12} & r_{13} & -\mathbf{p}^T \cdot \mathbf{r}_1 \\ r_{21} & r_{22} & r_{23} & -\mathbf{p}^T \cdot \mathbf{r}_2 \\ r_{31} & r_{32} & r_{33} & -\mathbf{p}^T \cdot \mathbf{r}_3 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

whereas  $\mathbf{r}_1$ ,  $\mathbf{r}_2$ ,  $\mathbf{r}_3$  and  $\mathbf{p}$  are the four column vectors of (1) and  $\cdot$  represents the scalar product of vectors.

One has the following transformations:

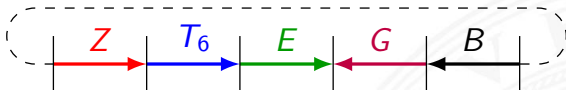
- ▶  $Z$ :  
World  $\rightarrow$  Manipulator base
- ▶  $T_6$ :  
Manipulator base  $\rightarrow$  Manipulator end
- ▶  $E$ :  
Manipulator end  $\rightarrow$  Endeffector
- ▶  $B$ :  
World  $\rightarrow$  Object
- ▶  $G$ :  
Object  $\rightarrow$  Endeffector



# Transformation equation

There are two descriptions for the desired endeffector position, one in relation to the object and the other in relation to the manipulator. Both descriptions should equal to each other for grasping:

$$ZT_6E = BG$$



In order to find the manipulator transformation:

$$T_6 = Z^{-1}BGE^{-1}$$

In order to determine the position of the object:

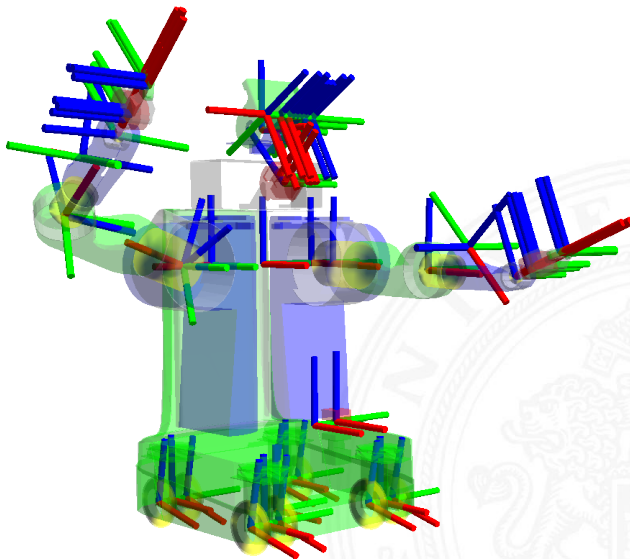
$$B = ZT_6EG^{-1}$$

This is also called kinematic chain.

# Example: coordinate transformation

Coordinate systems - Transformation equation

Introduction to Robotics







# Summary of homogeneous transformations

- ▶ A homogeneous transformation depicts the position and orientation of a coordinate frame in space.
- ▶ If the coordinate frame is defined in relation to a solid object, the position and orientation of the solid object is unambiguously specified.
- ▶ The depiction of an object  $A$  can be derived from a homogeneous transformation relating to object  $A'$ . This is also possible the other way around using inverse transformation.

# Summary of homogeneous transformations (cont.)

- ▶ Several translations and rotations can be multiplied. The following applies:
  - ▶ If the rotations / translations are performed in relation to the **current, newly defined (or changed)** coordinate system, the newly added transformation matrices need to be multiplicatively appended on the **right-hand** side.
  - ▶ If all of them are performed in relation to the **fixed** reference coordinate system, the transformation matrices need to be multiplicatively appended on the **left-hand side**.
- ▶ A homogeneous transformation can be segmented into a rotational and a translational part.

## Reduction to area of interest

For grasping, position and orientation of the robot **gripper** are of interest.

The robot itself is reduced to a single transformation and treated as a solid object.

- ▶ Joint coordinates:

A vector  $\mathbf{q}(t) = (q_1(t), q_2(t), \dots, q_n(t))^T$   
(a robot configuration)

- ▶ Endeffector coordinates

(Object coordinates):

A Vector  $\mathbf{p} = [p_x, p_y, p_z]^T$

- ▶ Description of orientations:

- ▶ Euler angle  $\varphi, \theta, \psi$
- ▶ Rotation matrix:

$$R = \begin{bmatrix} r_{11} & r_{12} & r_{13} \\ r_{21} & r_{22} & r_{23} \\ r_{31} & r_{32} & r_{33} \end{bmatrix}$$

# Outlook: Denavit-Hartenberg Convention

- ▶ Definition of one coordinate system per segment  $i = 1..n$
- ▶ Definition of 4 parameters per segment  $i = 1..n$
- ▶ Definition of one transformation  $A_i$  per segment  $i = 1..n$
- ▶  $T_6 = \prod_{i=1}^n A_i$

## Outlook

Later Denavit Hartenberg Convention will be presented in more detail!

- ▶ The direct kinematic problem:  
Given the joint values and geometrical parameters of all joints of a manipulator, how is it possible to determine the position and orientation of the manipulator's endeffector?
- ▶ The inverse kinematic problem:  
Given a desired position and orientation of the manipulator's endeffector and the geometrical parameters of all joints, is it possible for the manipulator to reach this position / orientation? If it is, how many manipulator configurations are capable of matching these conditions?

## Example

A two-joint-manipulator moving on a plane

$T_6$  defines, how the  $n$  joint angles are supposed to be consolidated to 12 non-linear formulas in order to describe 6 cartesian degrees of freedom.

- ▶ Forward kinematics  $K$  defined as:
  - ▶  $K : \vec{\theta} \in \mathcal{R}^n \rightarrow \vec{x} \in \mathcal{R}^6$
  - ▶ Joint angle  $\rightarrow$  Position + Orientation
- ▶ Inverse kinematics  $K^{-1}$  defined as:
  - ▶  $K^{-1} : \vec{x} \in \mathcal{R}^6 \rightarrow \vec{\theta} \in \mathcal{R}^n$
  - ▶ Position + Orientation  $\rightarrow$  Joint angle
  - ▶ non-trivial, since  $K$  is usually not unambiguously invertible

Non-linear kinematics  $K$  can be linearized through the *Taylor series*

$$f(x) = \sum_{n=0}^{\infty} \frac{f^{(n)}(x_0)}{n!} (x - x_0)^n.$$

- ▶ The Jacobian matrix  $J$  as factor for  $n = 1$  of the multi-dimensional Taylor series is defined as:
  - ▶  $J(\vec{\theta}) : \dot{\vec{\theta}} \in \mathcal{R}^n \rightarrow \dot{\vec{x}} \in \mathcal{R}^6$
  - ▶ Joint speed  $\rightarrow$  cartesian speed
- ▶ Inverse Jacobian matrix  $J^{-1}$  defined as:
  - ▶  $J^{-1}(\vec{\theta}) : \dot{\vec{x}} \in \mathcal{R}^6 \rightarrow \dot{\vec{\theta}} \in \mathcal{R}^n$
  - ▶ cartesian speed  $\rightarrow$  Joint speed
  - ▶ non-trivial, since  $J$  not necessarily invertible (e.g. not quadratic)



Since  $T_6$  describes only the target **position**, explicit generation of a trajectory is necessary.

Depending on *constraints* different for:

- ▶ joint angle space
- ▶ cartesian space

Interpolation through:

- ▶ piecewise straight lines
- ▶ piecewise polynoms
- ▶ B-Splines
- ▶ ...

- ▶ Read (available on google & library):
  - ▶ J. F. Engelberger, *Robotics in service*. MIT Press, 1989
  - ▶ K. Fu, R. González, and C. Lee, *Robotics: Control, Sensing, Vision, and Intelligence*. McGraw-Hill series in CAD/CAM robotics and computer vision, McGraw-Hill, 1987
  - ▶ R. Paul, *Robot Manipulators: Mathematics, Programming, and Control: the Computer Control of Robot Manipulators*. Artificial Intelligence Series, MIT Press, 1981
  - ▶ J. Craig, *Introduction to Robotics: Pearson New International Edition: Mechanics and Control*. Always learning, Pearson Education, Limited, 2013
- ▶ Repeat your linear algebra knowledge, especially regarding elementary algebra of matrices.



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Department of Informatics



# Introduction to Robotics

## Lecture 2

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Faculty of Mathematics, Informatics and Natural Sciences  
Department of Informatics

Technical Aspects of Multimodal Systems

July 12, 2018



## Introduction

## Coordinate systems

## Kinematic Equations

- Denavit-Hartenberg convention

- Parameters for describing two arbitrary links

- Example DH-Parameter of a single joint

- Example DH-Parameter for a manipulator

- Example featuring PUMA 560

- Example featuring Mitsubishi PA10-7C

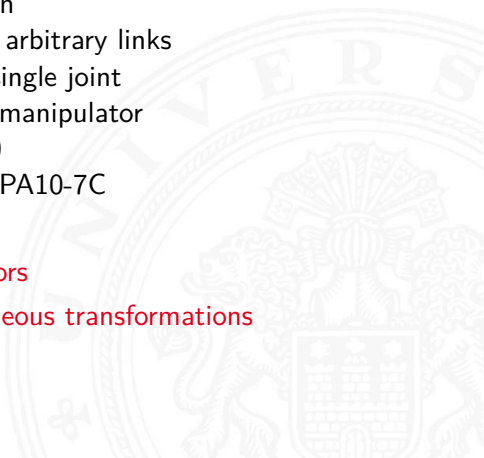
## Robot Description

## Inverse Kinematics for Manipulators

## Differential motion with homogeneous transformations

## Jacobian

## Trajectory planning





# Outline (cont.)

Kinematic Equations

Introduction to Robotics

Trajectory generation

Dynamics

Principles of Walking

Robot Control

Task-Level Programming and Trajectory Generation

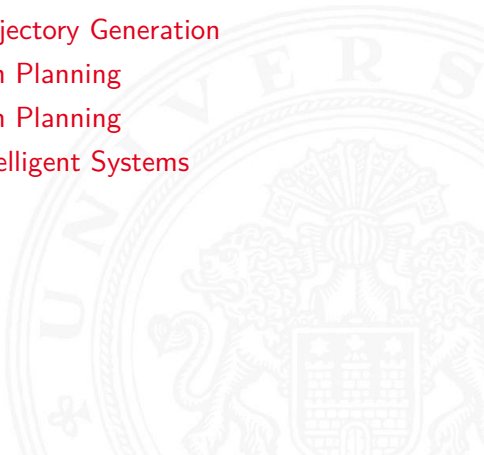
Task-level Programming and Path Planning

Task-level Programming and Path Planning

Architectures of Sensor-based Intelligent Systems

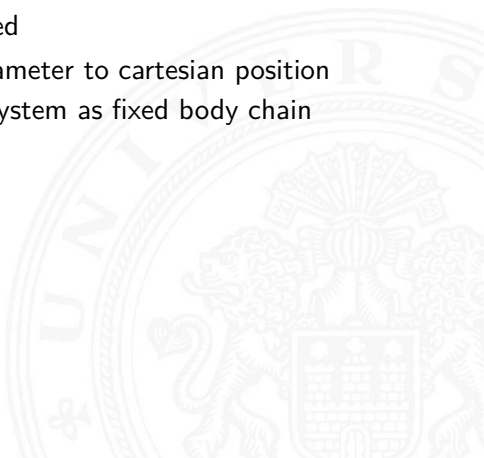
Summary

Conclusion and Outlook





- ▶ Movement depiction of mechanical systems
- ▶ Here, only position is addressed
- ▶ Translate a series of joint parameter to cartesian position
- ▶ Depiction of the mechanical system as fixed body chain
  - ▶ Serial robots
- ▶ Types of joints
  - ▶ rotational joints
  - ▶ prismatic joints



# Mitsubishi PA10-6C

Kinematic Equations

Introduction to Robotics



- ▶ Transformation regulation, which describes the relation between joint coordinates of a robot  $\mathbf{q}$  and the environment coordinates of the endeffector  $\mathbf{x}$
- ▶ Solely determined by the geometry of the robot
  - ▶ Base frame
  - ▶ Relation of frames to one another  
     $\implies$  Formation of a recursive chain
  - ▶ Joint coordinates:

$$q_i = \begin{cases} \theta_i & : \text{rotational joint} \\ d_i & : \text{translation joint} \end{cases}$$

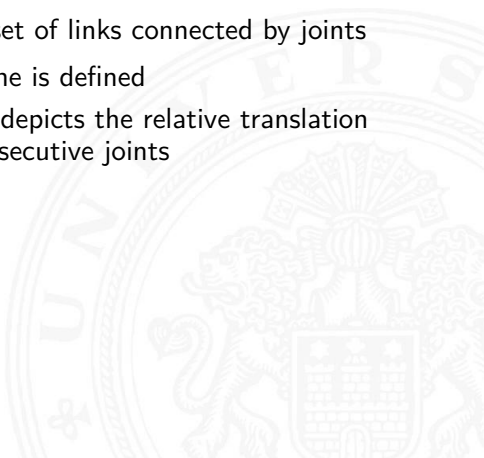
## Purpose

Absolute determination of the position of the endeffector (TCP) in the cartesian coordinate system





- ▶ Manipulator is considered as set of links connected by joints
- ▶ In each link, a coordinate frame is defined
- ▶ A homogeneous matrix  ${}^{i-1}A_i$  depicts the relative translation and rotation between two consecutive joints
  - ▶ Joint transition



For a manipulator consisting of six joints:

- ▶  ${}^0A_1$ : depicts position and orientation of the first link
- ▶  ${}^1A_2$ : position/orientation of the 2nd link with respect to link 1
- ▶  $\vdots$
- ▶  ${}^5A_6$ : depicts position and orientation of the 6th link in regard to link 5

The resulting product is defined as:

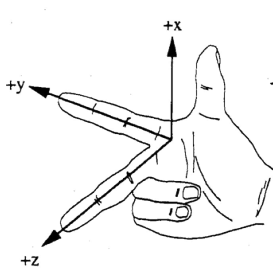
$$T_6 = {}^0A_1 {}^1A_2 {}^2A_3 {}^3A_4 {}^4A_5 {}^5A_6$$

- ▶ Calculation of  $T_6 = \prod_{i=1}^n A_i$   $A_i$  short for  ${}^{i-1}A_i$ 
  - ▶  $T_6$  defines, how  $n$  joint transitions describe 6 cartesian DOF
- ▶ Definition of one coordinate system (CS) per segment  $i$ 
  - ▶ generally arbitrary definition
- ▶ Determination of one transformation  $A_i$  per segment  $i = 1..n$ 
  - ▶ generally 6 parameters (3 rotational + 3 translational) required
  - ▶ different sets of parameters and transformation orders possible

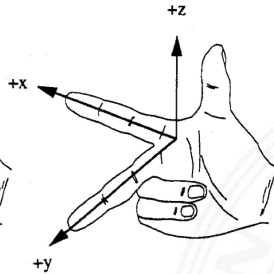
## Solution

### Denavit-Hartenberg (DH) convention

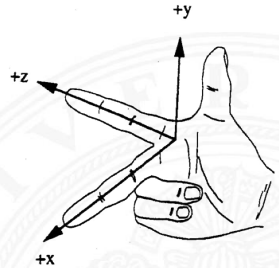
# Right-Handed Coordinate System



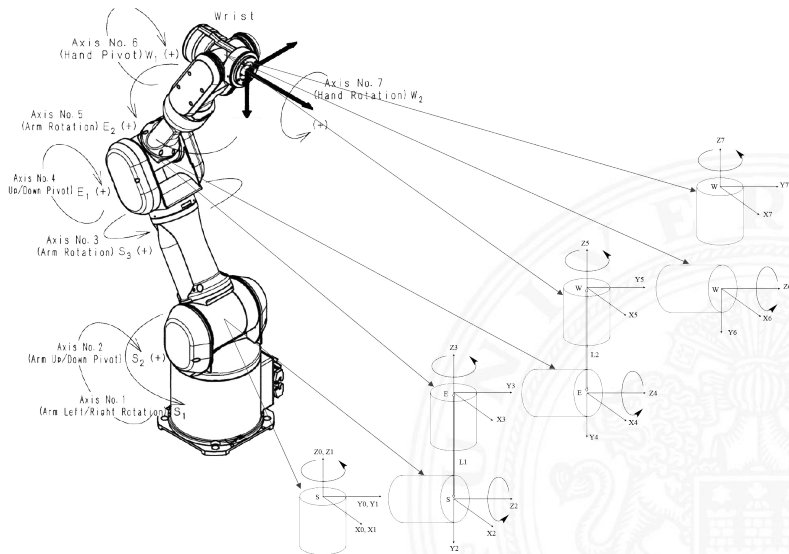
Configuration 1



Configuration 2



Configuration 3





# Tool Center Point (TCP) description

Using a vector  $\vec{p}$ , the TCP position is depicted.

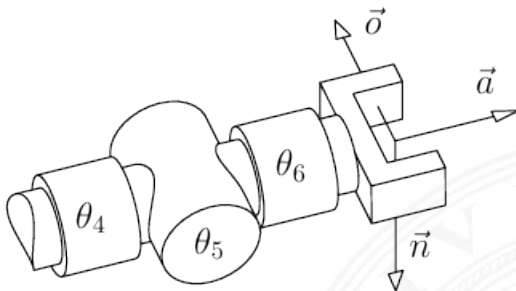
Three unit vectors:

- ▶  $\vec{a}$ : (approach vector),
- ▶  $\vec{o}$ : (orientation vector),
- ▶  $\vec{n}$ : (normal vector)

specify the orientation of the TCP.



# Tool Center Point (TCP) description (cont.)



Thus, the transformation  $T$  consists of the following elements:

$$T = \begin{bmatrix} \vec{n} & \vec{o} & \vec{a} & \vec{p} \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

- ▶ first published by Denavit and Hartenberg in 1955
- ▶ established principle
- ▶ determination of a transformation matrix  $A_i$  using **four** parameter
  - ▶ joint length, joint twist, joint offset and joint angle  
( $a_i, \alpha_i, d_i, \theta_i$ )
- ▶ complex transformation matrix  $A_i$  results from four atomic transformations

## Transformation order

Classic:

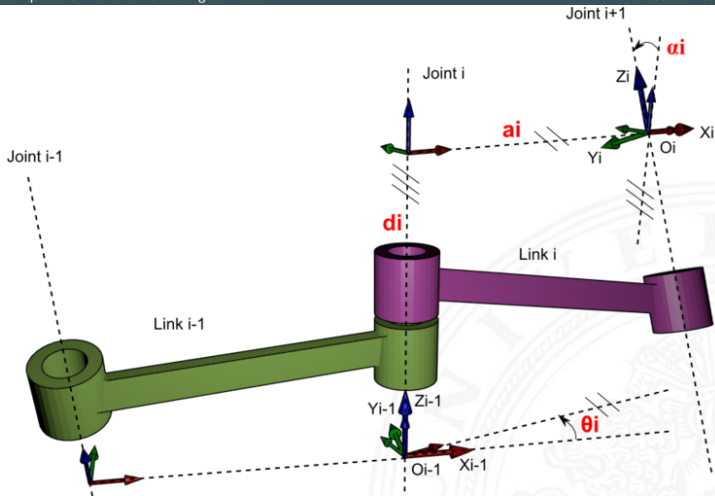
$$A_i = R_{z_{i-1}}(\theta_i) \cdot T_{z_{i-1}}(d_i) \cdot T_{x_i}(a_i) \cdot R_{x_i}(\alpha_i) \rightarrow CS_i$$

Modified:

$$A_i = R_{x_{i-1}}(\alpha_{i-1}) \cdot T_{x_{i-1}}(a_{i-1}) \cdot R_{z_i}(\theta_i) \cdot T_{z_i}(d_i) \rightarrow CS_i$$



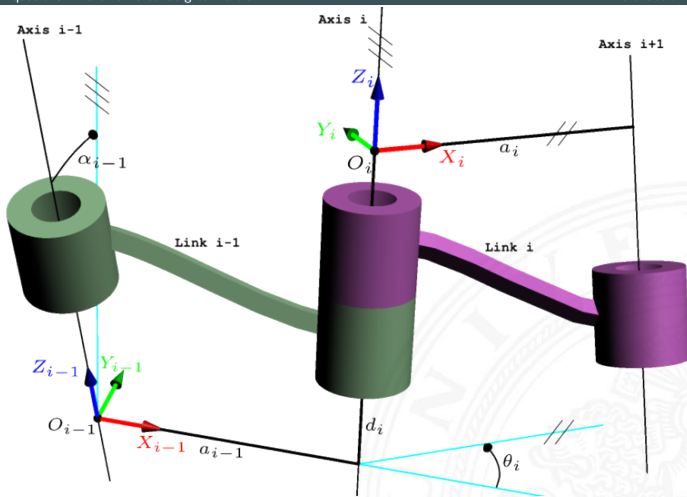
# Classic Parameters



## Transformation order

$$A_i = R_{Z_{i-1}}(\theta_i) \cdot T_{Z_{i-1}}(d_i) \cdot T_{X_i}(a_i) \cdot R_{X_i}(\alpha_i) \rightarrow CS_i$$

# Modified Parameters



Transformation order

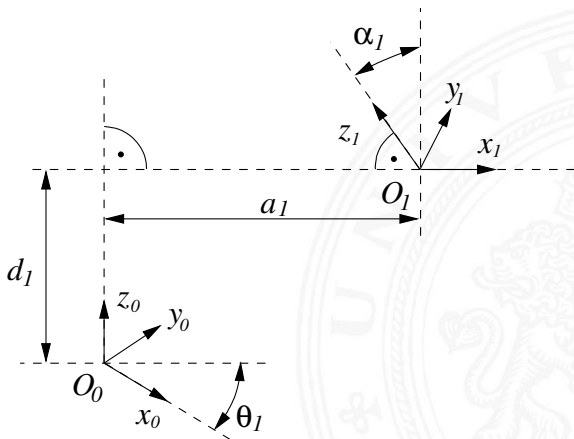
$$A_i = R_{X_{i-1}}(\alpha_{i-1}) \cdot T_{X_{i-1}}(a_{i-1}) \cdot R_{Z_i}(\theta_i) \cdot T_{X_i}(d_i) \rightarrow CS_i$$

# DH-Parameters and -Preconditions (classic)

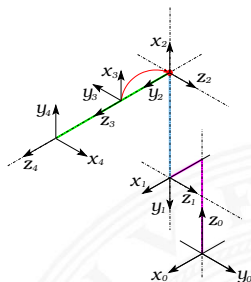
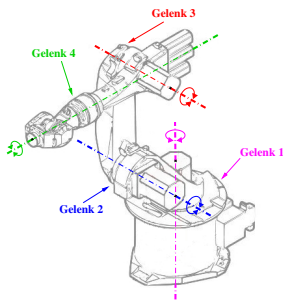
Idea: Determination of the transformation matrix  $A_i$  using four joint parameters ( $a_i, \alpha_i, d_i, \theta_i$ ) and two preconditions

**DH<sub>1</sub>**  $x_i$  is perpendicular to  $z_{i-1}$

**DH<sub>2</sub>**  $x_i$  intersects  $z_{i-1}$



# Definition of joint coordinate systems (classic)



- ▶  $CS_0$  is the stationary origin at the base of the manipulator
- ▶ axis  $z_{i-1}$  is set along the axis of motion of the  $i^{th}$  joint
- ▶ axis  $x_i$  is parallel to the common normal of  $z_{i-1}$  and  $z_i$  ( $x_i \parallel (z_{i-1} \times z_i)$ ).
- ▶ axis  $y_i$  concludes a right-handed coordinate system

# Frame transformation for two links (classic)

Creation of the relation between frame  $i$  and frame  $(i - 1)$  through the following rotations and translations:

- ▶ Rotate around  $z_{i-1}$  by angle  $\theta_i$
- ▶ Translate along  $z_{i-1}$  by  $d_i$
- ▶ Translate along  $x_i$  by  $a_i$
- ▶ Rotate around  $x_i$  by angle  $\alpha_i$

Using the product of four homogeneous transformations, which transform the coordinate frame  $i - 1$  into the coordinate frame  $i$ , the matrix  $A_i$  can be calculated as follows:

$$A_i = R_{z_{i-1}}(\theta_i) \cdot T_{z_{i-1}}(d_i) \cdot T_{x_i}(a_i) \cdot R_{x_i}(\alpha_i) \rightarrow CS_i$$

# Frame transformation for two links (classic) (cont.)

$$A_i = \begin{bmatrix} C\theta_i & -S\theta_i & 0 & 0 \\ S\theta_i & C\theta_i & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} \dots & 0 \\ \dots & 0 \\ \dots & d_i \\ \dots & 1 \end{bmatrix} \begin{bmatrix} \dots & a_i \\ \dots & 0 \\ \dots & 0 \\ \dots & 1 \end{bmatrix} \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & C\alpha_i & -S\alpha_i & 0 \\ 0 & S\alpha_i & C\alpha_i & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$
$$= \begin{bmatrix} C\theta_i & -S\theta_i C\alpha_i & S\theta_i S\alpha_i & a_i C\theta_i \\ S\theta_i & C\theta_i C\alpha_i & -C\theta_i S\alpha_i & a_i S\theta_i \\ 0 & S\alpha_i & C\alpha_i & d_i \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

► using  $DH_1$   $x_1 \cdot z_0 = 0$

$$0 = {}^0x_1 \cdot {}^0z_0 \quad (2)$$

$$0 = ({}^0A_{1x_1})^T \cdot z_0 \quad (3)$$

$$= \left( \begin{bmatrix} r_{11} & r_{12} & r_{13} \\ r_{21} & r_{22} & r_{23} \\ r_{31} & r_{32} & r_{33} \end{bmatrix} \begin{bmatrix} 1 \\ 0 \\ 0 \end{bmatrix} \right)^T \cdot \begin{bmatrix} 0 \\ 0 \\ 1 \end{bmatrix} \quad (4)$$

$$= [r_{11} \quad r_{21} \quad r_{31}] \begin{bmatrix} 0 \\ 0 \\ 1 \end{bmatrix} \quad (5)$$

$$= r_{31} \quad (6)$$

$$\Rightarrow \begin{bmatrix} r_{11} & r_{12} & r_{13} \\ r_{21} & r_{22} & r_{23} \\ 0 & r_{32} & r_{33} \end{bmatrix}$$

# Background of DH-convention (cont.)

- ▶ with  ${}^{i-1}R_i$  being orthogonal and orthonormal

$$r_{11}^2 + r_{21}^2 = 1 \quad (7)$$

$$r_{32}^2 + r_{33}^2 = 1 \quad (8)$$

$(r_{11}, r_{21}) = (\cos \theta, \sin \theta)$  and  
 $(r_{32}, r_{33}) = (\sin \alpha, \cos \alpha)$   
fulfill the constraint;

$$\Rightarrow \begin{bmatrix} \cos \theta & r_{12} & r_{13} \\ \sin \theta & r_{22} & r_{23} \\ 0 & \sin \alpha & \cos \alpha \end{bmatrix}$$

- ▶  $r_{12}, r_{13}, r_{22}$  and  $r_{23}$  can complete the rotational matrix

$$\Rightarrow \begin{bmatrix} \cos \theta_i & -\sin \theta_i \cos \alpha_i & \sin \theta_i \sin \alpha_i \\ \sin \theta_i & \cos \theta_i \cos \alpha_i & -\cos \theta_i \sin \alpha_i \\ 0 & \sin \alpha_i & \cos \alpha_i \end{bmatrix}$$



# Background of DH-convention (cont.)

- ▶ with  $DH_2$  and  $DH_1$ :

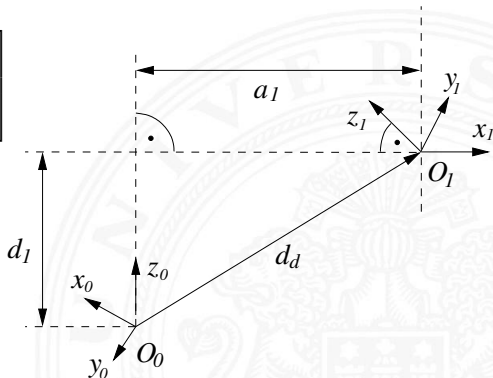
the positional vector  $d_d$  from  $O_0$  to  $O_1$  may be represented as a linear combination of vectors  $z_0$  and  $x_1$

$${}^0d_d = d z_0 + a {}^0A_1 x_1$$

$$= d \begin{bmatrix} 0 \\ 0 \\ 1 \end{bmatrix} + a {}^0R_1 \begin{bmatrix} 1 \\ 0 \\ 0 \end{bmatrix}$$

$$= d \begin{bmatrix} 0 \\ 0 \\ 1 \end{bmatrix} + a \begin{bmatrix} \cos\theta \\ \sin\theta \\ 0 \end{bmatrix}$$

$$= \begin{bmatrix} a \cos\theta \\ a \sin\theta \\ d \end{bmatrix}$$



# Background of DH-convention (cont.)

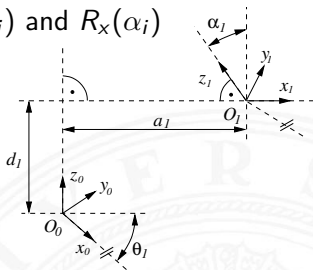
- ▶ homogeneous transformation  $A_i$  fulfills  $DH_2$  and  $DH_1$

$$\begin{aligned} A_i &= R_z(\theta_i) \cdot T_z(d_i) \cdot T_x(a_i) \cdot R_x(\alpha_i) \\ &= \begin{bmatrix} \cos \theta_i & -\sin \theta_i & 0 & 0 \\ \sin \theta_i & \cos \theta_i & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & d_i \\ 0 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} 1 & 0 & 0 & a_i \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & \cos \alpha_i & -\sin \alpha_i & 0 \\ 0 & \sin \alpha_i & \cos \alpha_i & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \\ &= \begin{bmatrix} \cos \theta_i & -\sin \theta_i \cos \alpha_i & \sin \theta_i \sin \alpha_i & a_i \cos \theta_i \\ \sin \theta_i & \cos \theta_i \cos \alpha_i & -\cos \theta_i \sin \alpha_i & a_i \sin \theta_i \\ 0 & \sin \alpha_i & \cos \alpha_i & d_i \\ 0 & 0 & 0 & 1 \end{bmatrix} \end{aligned}$$

# Partial order of transformation

Calculation of homogeneous transformation matrix  $A_1$  from the partial transformations  $R_z(\theta_1)$ ,  $T_z(d_1)$ ,  $T_x(a_1)$  and  $R_x(\alpha_1)$

- ▶ transition  $CS_0$  to  $CS_1$  using local axes
- ▶ invariances
  - ▶  $T_x$  invariant to  $R_x$  ( $T_x R_x = R_x T_x$ )
  - ▶  $T_z$  invariant to  $R_z$  ( $T_z R_z = R_z T_z$ )



- ▶ order of transformations
  - ▶ rotation around  $z_1$  **after** rotation around  $x_0$  violates **DH<sub>2</sub>**
  - ▶ thus, possible rotation orders which do not violate **DH<sub>2</sub>** and **DH<sub>1</sub>**:

$$A_i = R_{x_1'''}(\alpha_1) \cdot T_{x_1''}(a_1) \cdot T_{z_1'}(d_1) \cdot R_{z_0}(\theta_1) \quad (9)$$

$$= R_{z_0}(\theta_1) \cdot T_{z_0}(d_1) \cdot T_{x_1}(a_1) \cdot R_{x_1}(\alpha_1) \quad (10)$$

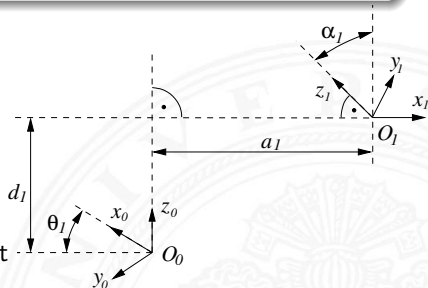
- (9) is a possible valid transformation order
- (10) is the standard transformation order

# Definition of joint coordinate systems: Exceptions

## Beware

The Denavit-Hartenberg convention is not unambiguous!

- ▶  $z_{i-1}$  is parallel to  $z_i$ 
  - ▶ arbitrary shortest normal
  - ▶ usually  $d_i = 0$  is chosen
- ▶  $z_{i-1}$  intersects  $z_i$ 
  - ▶ usually  $a_i = 0$  such that CS lies in the intersection point
- ▶ orientation of  $CS_n$  ambiguous, as no joint  $n + 1$  exists
  - ▶  $x_n$  must be a normal to  $z_{n-1}$
  - ▶ usually  $z_n$  chosen to point in the direction of the approach vector  $\vec{a}$  of the tcp

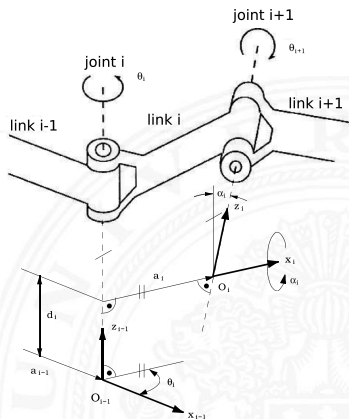


# Parameters for description of two arbitrary links

Two parameters for the description of the link structure  $i$

- ▶  $a_i$ : shortest distance between the  $z_{i-1}$ -axis and the  $z_i$ -axis
- ▶  $\alpha_i$ : rotation angle around the  $x_i$ -axis, which aligns the  $z_{i-1}$ -axis to the  $z_i$ -axis

$a_i$  and  $\alpha_i$  are constant values due to construction



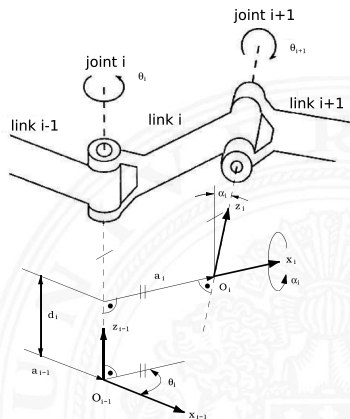
# Parameters for describing two arbitrary links (cont.)

Two for relative distance and angle of adjacent links

- ▶  $d_i$ : distance origin  $O_{i-1}$  of the  $(i-1)^{\text{st}}$  CS to intersection of  $z_{i-1}$ -axis with  $x_i$ -axis
- ▶  $\theta_i$ : joint angle around  $z_{i-1}$ -axis to align  $x_{i-1}$ -parallel to  $x_i$ -axis into  $x_{i-1}, y_{i-1}$ -plane

$\theta_i$  and  $d_i$  are variable

- ▶ rotational:  $\theta_i$  variable,  $d_i$  fixed
- ▶ translational:  $d_i$  variable,  $\theta_i$  fixed



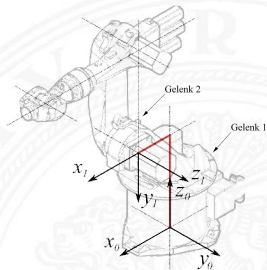
# Example DH-Parameter of a single joint

Determination of DH-Parameter  $(\theta, d, a, \alpha)$  for calculation of joint transformation:  $A_1 = R_z(\theta_1)T_z(d_1)T_x(a_1)R_x(\alpha_1)$

**joint angle** rotate by  $\theta_1$  around  $z_0$ , such that  $x_0$  is parallel to  $x_1$

$$R_z(\theta_1) = \begin{bmatrix} \cos \theta_1 & -\sin \theta_1 & 0 & 0 \\ \sin \theta_1 & \cos \theta_1 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

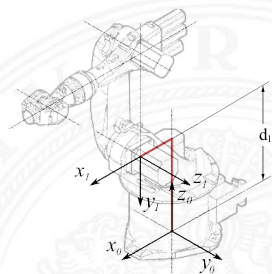
for the shown joint configuration  $\theta_1 = 0^\circ$



# Example DH-Parameter of a single joint (cont.)

**joint offset** translate by  $d_1$  along  $z_0$  until the intersection of  $z_0$  and  $x_1$

$$T_z(d_1) = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & d_1 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

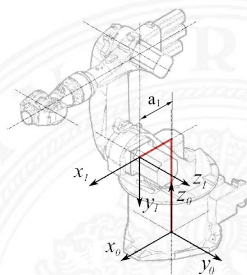




# Example DH-Parameter of a single joint (cont.)

**joint length** translate by  $a_1$  along  $x_1$  such that the origins of both CS are congruent

$$T_x(a_1) = \begin{bmatrix} 1 & 0 & 0 & a_1 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

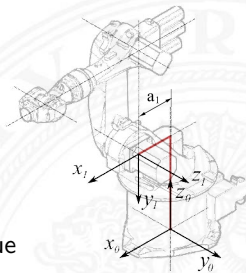


# Example DH-Parameter of a single joint (cont.)

**joint twist** rotate  $z_0$  by  $\alpha_1$  around  $x_1$ , such that  $z_0$  lines up with  $z_1$

$$R_{x(\alpha_1)} = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & \cos(\alpha_1) & -\sin(\alpha_1) & 0 \\ 0 & \sin(\alpha_1) & \cos(\alpha_1) & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

for the shown joint configuration,  $\alpha_1 = -90^\circ$  due to construction



# Example DH-Parameter of a single joint (cont.)

- ▶ total transformation of  $CS_0$  to  $CS_1$  (general case)

$$\begin{aligned} {}^0A_1 &= R_z(\theta_1) \cdot T_z(d_1) \cdot T_x(a_1) \cdot R_x(\alpha_1) \\ &= \begin{bmatrix} \cos\theta_1 & -\sin\theta_1 \cos\alpha_1 & \sin\theta_1 \sin\alpha_1 & a_1 \cos\theta_1 \\ \sin\theta_1 & \cos\theta_1 \cos\alpha_1 & -\cos\theta_1 \sin\alpha_1 & a_1 \sin\theta_1 \\ 0 & \sin\alpha_1 & \cos\alpha_1 & d_1 \\ 0 & 0 & 0 & 1 \end{bmatrix} \end{aligned}$$

- ▶ rotary case: variable  $\theta_1$  and fixed  $d_1, a_1$  und ( $\alpha_1 = -90^\circ$ )

$$\begin{aligned} {}^0A_1 &= R_z(\theta_1) \cdot T_z(d_1) \cdot T_x(a_1) \cdot R_x(-90^\circ) \\ &= \begin{bmatrix} \cos\theta_1 & 0 & -\sin\theta_1 & a_1 \cos\theta_1 \\ \sin\theta_1 & 0 & \cos\theta_1 & a_1 \sin\theta_1 \\ 0 & -1 & 0 & d_1 \\ 0 & 0 & 0 & 1 \end{bmatrix} \end{aligned}$$

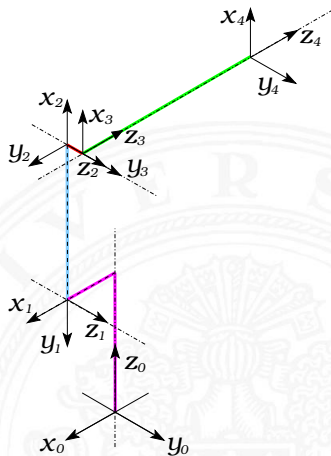
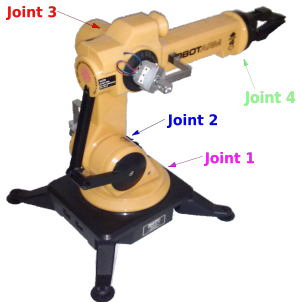


# Procedure for predefined structure

- ▶ Fixed origin:  $CS_0$  is the fixed frame at the base of the manipulator
- ▶ Determination of axes and consecutive numbering from 1 to  $n$
- ▶ Positioning  $O_i$  on rotation- or shear-axis  $i$ ,  $z_i$  points away from  $z_{i-1}$
- ▶ Determination of normal between the axes; setting  $x_i$  (in direction to the normal)
- ▶ Determination of  $y_i$  (right-hand system)
- ▶ Read off Denavit-Hartenberg parameter
- ▶ Calculation of overall transformation

# Example DH-Parameter for Quickshot

- ▶ Definition of CS corresponding to DH convention
- ▶ Determination of DH-Parameter



# Example Transformation matrix $T_6$

$$\begin{aligned} T_6 &= A_1 \cdot A_2 \cdot A_3 \cdot A_4 \\ &= \begin{bmatrix} \cos \theta_1 & 0 & -\sin \theta_1 & 20 \cos \theta_1 \\ \sin \theta_1 & 0 & \cos \theta_1 & 20 \sin \theta_1 \\ 0 & -1 & 0 & 100 \\ 0 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} \cos \theta_2 & -\sin \theta_2 & 0 & 160 \cos \theta_2 \\ \sin \theta_2 & \cos \theta_2 & 0 & 160 \sin \theta_2 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \\ &\quad \begin{bmatrix} \cos \theta_3 & 0 & \sin \theta_3 & 0 \\ \sin \theta_3 & 0 & -\cos \theta_3 & 0 \\ 0 & 1 & 0 & 28 \\ 0 & 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} \cos \theta_4 & -\sin \theta_4 & 0 & 0 \\ \sin \theta_4 & \cos \theta_4 & 0 & 0 \\ 0 & 0 & 1 & 250 \\ 0 & 0 & 0 & 1 \end{bmatrix} \\ &= \begin{bmatrix} \cos \theta_1 \cos \theta_4 (\cos \theta_2 \cos \theta_3 - \sin \theta_2 \sin \theta_3) - \sin \theta_1 \sin \theta_4 & \dots & \dots & \dots \\ \sin \theta_1 \cos \theta_4 (\sin \theta_2 \cos \theta_3 + \cos \theta_2 \sin \theta_3) + \cos \theta_1 \sin \theta_4 & \dots & \dots & \dots \\ -\cos \theta_4 (\sin \theta_2 \cos \theta_3 + \cos \theta_2 \sin \theta_3) & \dots & \dots & \dots \\ 0 & 0 & 0 & 1 \end{bmatrix} \end{aligned}$$

In order to transfer the manipulator-endpoint into the base coordinate system,  $T_6$  is calculated as follows:

$$T_6 = A_1 A_2 A_3 A_4 A_5 A_6$$

Z: Transformation manipulator base  $\rightarrow$  reference coordinate system

E: Manipulator endpoint  $\rightarrow$  TCP (“tool center point”)

X: The position and orientation of the TCP in relation of the reference coordinate system

$$X = ZT_6E$$

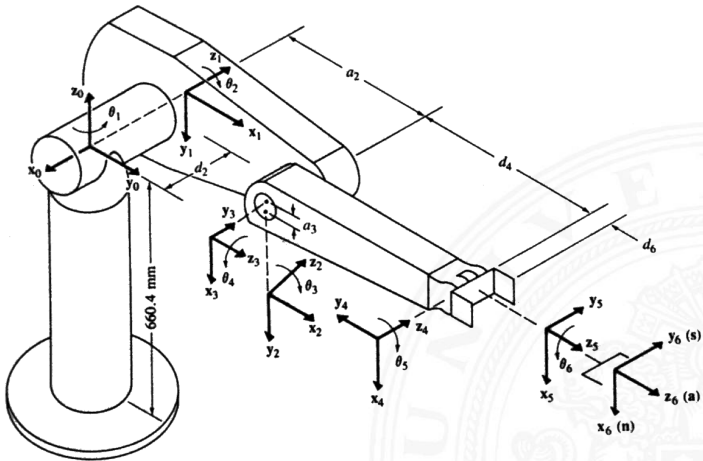
The following applies as well:

$$T_6 = Z^{-1}XE^{-1}$$

# Example featuring PUMA 560 (cont.)

Kinematic Equations - Example featuring PUMA 560

Introduction to Robotics





$$T_6^0 = T_1^0 T_2^1 T_3^2 T_4^3 T_5^4 T_6^5$$

$${}^0T_1 = \begin{bmatrix} C\theta_1 & -S\theta_1 & 0 & 0 \\ S\theta_1 & C\theta_1 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

$${}^1T_2 = \begin{bmatrix} C\theta_2 & -S\theta_2 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ -S\theta_2 & -C\theta_2 & 0 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

# Link Transformations (cont.)

$${}^2T_3 = \begin{bmatrix} C\theta_3 & -S\theta_3 & 0 & a_2 \\ S\theta_3 & C\theta_3 & 0 & 0 \\ 0 & 0 & 1 & d_3 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

$${}^3T_4 = \begin{bmatrix} C\theta_4 & -S\theta_4 & 0 & a_3 \\ 0 & 0 & 1 & d_4 \\ -S\theta_4 & -C\theta_4 & 0 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

# Link Transformations (cont.)

$${}^4T_5 = \begin{bmatrix} C\theta_5 & -S\theta_5 & 0 & 0 \\ 0 & 0 & -1 & 0 \\ -S\theta_5 & -C\theta_5 & 0 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

$${}^4T_5 = \begin{bmatrix} C\theta_6 & -S\theta_6 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ -S\theta_6 & -C\theta_6 & 0 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

# The solution using the example of PUMA 560

## Sum-of-Angle formula

$$C_{23} = C_2 C_3 - S_2 S_3,$$

$$S_{23} = C_2 S_3 + S_2 C_3$$

$$T_6^0 = T_1^0 T_2^1 T_3^2 T_4^3 T_5^4 T_6^5 = \begin{bmatrix} n_x & o_x & a_x & p_x \\ n_y & o_y & a_y & p_y \\ n_z & o_z & a_z & p_z \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

# The solution using the example of PUMA 560 (cont.)

$$n_x = C_1[C_{23}(C_4 C_5 C_6 - S_4 S_5) - S_{23} S_5 C_6] - S_1(S_4 C_5 C_6 + C_4 S_6)$$

$$n_y = S_1[C_{23}(C_4 C_5 C_6 - S_4 S_6) - S_{23} S_5 C_6] + C_1(S_4 C_5 C_6 + C_4 S_6)$$

$$n_z = -S_{23}[C_4 C_5 C_6 - S_4 S_6] - C_{23} S_5 C_6$$

$$o_x, o_y, o_z = \dots$$

$$a_x, a_y, a_z = \dots$$

$$p_x = C_1[a_2 C_2 + a_3 C_{23} - d_4 S_{23}] - d_3 S_1$$

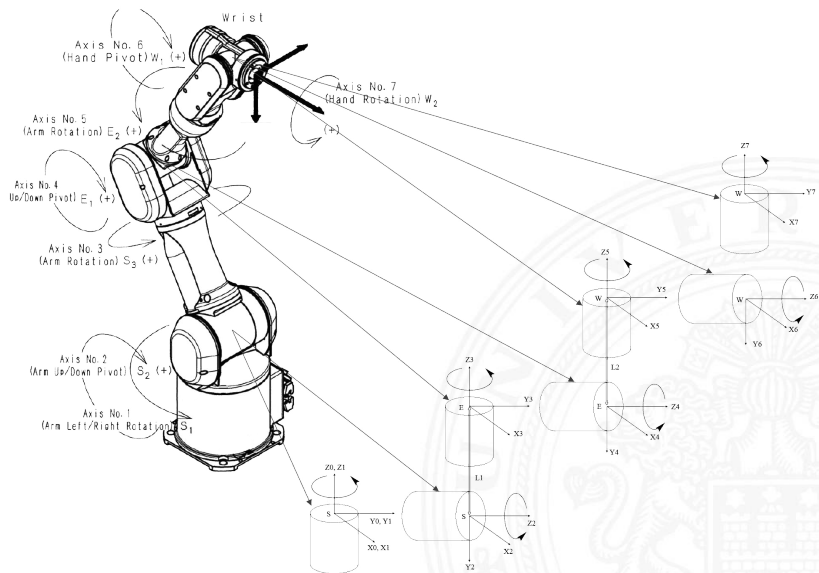
$$p_y = S_1[a_2 C_2 + a_3 C_{23} - d_4 S_{23}] + d_3 C_1$$

$$p_z = -a_3 S_{23} - a_2 S_2 - d_4 C_{23}$$

# Mitsubishi PA10-7C

Kinematic Equations - Example featuring Mitsubishi PA10-7C

Introduction to Robotics





Universität Hamburg

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MIN Faculty  
Department of Informatics



# Introduction to Robotics

## Lecture 3

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University of Hamburg  
Faculty of Mathematics, Informatics and Natural Sciences  
Department of Informatics

**Technical Aspects of Multimodal Systems**

July 12, 2018



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Coordinate systems

Kinematic Equations

Robot Description

- Recapitulation of DH-Parameter

- URDF

Inverse Kinematics for Manipulators

Differential motion with homogeneous transformations

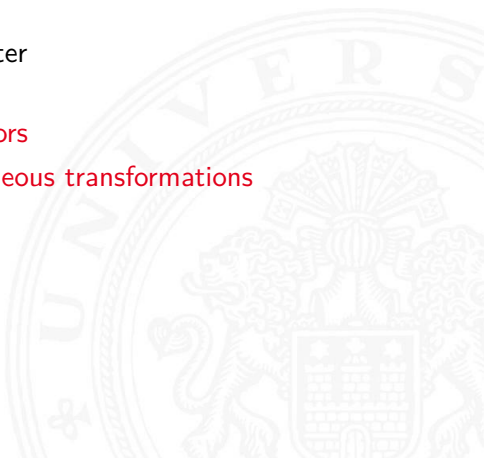
Jacobian

Trajectory planning

Trajectory generation

Dynamics

Principles of Walking







# Outline (cont.)

Robot Description

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Task-level Programming and Path Planning

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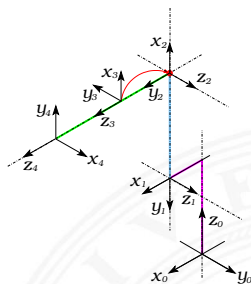
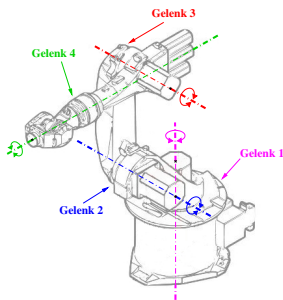


- ▶ universal minimal robot description
- ▶ based on frame transformations
- ▶ **four** parameters per frame transformation
- ▶ serial chain of transformations
- ▶ unique description of  $T_6$

## Drawbacks

- ▶ ambiguous convention
- ▶ only kinematic chain described
- ▶ missing information on geometry, physical constraints, dynamics, collisions, inertia, sensors, ...

# Definition of joint coordinate systems



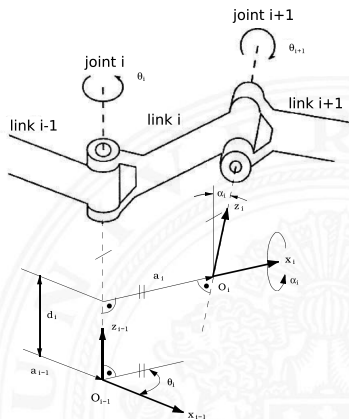
- ▶  $CS_0$  is the stationary origin at the base of the manipulator
- ▶ axis  $z_{i-1}$  is set along the axis of motion of the  $i^{th}$  joint
- ▶ axis  $x_i$  is the common normal of  $z_{i-1} \times z_i$
- ▶ axis  $y_i$  concludes a right-handed coordinate system

# Parameters for description of two arbitrary links

Two parameters for the description of the link structure  $i$

- ▶  $a_i$ : shortest distance between the  $z_{i-1}$ -axis and the  $z_i$ -axis
- ▶  $\alpha_i$ : rotation angle around the  $x_i$ -axis, which aligns the  $z_{i-1}$ -axis to the  $z_i$ -axis

$a_i$  and  $\alpha_i$  are constant values due to construction



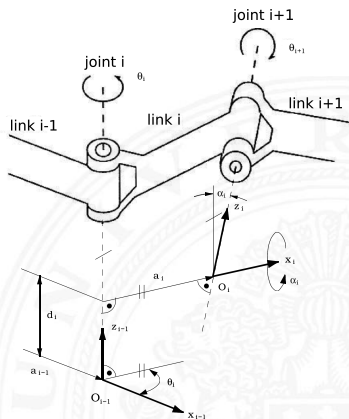
# Parameters for description of two arbitrary links (cont.)

Two for relative distance and angle of adjacent links

- ▶  $d_i$ : distance origin  $O_{i-1}$  of the  $(i-1)^{\text{st}}$  CS to intersection of  $z_{i-1}$ -axis with  $x_i$ -axis
- ▶  $\theta_i$ : joint angle around  $z_{i-1}$ -axis to align  $x_{i-1}$ -parallel to  $x_i$ -axis into  $x_{i-1}, y_{i-1}$ -plane

$\theta_i$  and  $d_i$  are variable

- ▶ rotational:  $\theta_i$  variable,  $d_i$  fixed
- ▶ translational:  $d_i$  variable,  $\theta_i$  fixed



## Documentation

<http://wiki.ros.org/urdf>

<http://wiki.ros.org/urdf/XML>

- ▶ robot description format used in ROS<sup>2</sup>
- ▶ hierarchical description of components
- ▶ XML format representing robot model
  - ▶ kinematics and dynamics
  - ▶ visual
  - ▶ collision
  - ▶ configuration

---

<sup>2</sup><http://ros.org>

**links** geometrical properties

- ▶ visual
- ▶ inertial
- ▶ collision

**joints** geometrical connections

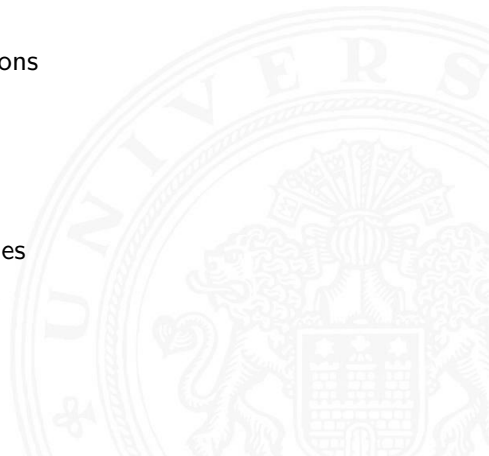
- ▶ geometry
- ▶ structure
- ▶ config

**sensors** attached sensors

**transmissions** transmission properties

**gazebo** simulation properties

**model\_state** robot state



- ▶ Filename: robotname.urdf
- ▶ XML prolog:

```
<?xml version="1.0" encoding="utf-8"?>
```

- ▶ XML element types

```
<tag attribute="value"/>
```

```
<tag attribute="value">  
  text or element(s)  
</tag>
```

- ▶ XML comments

```
<!-- Comments are placed within these tags -->
```



# URDF: XML Tree Structure (cont.)

- ▶ 1<sup>st</sup>-level structure

```
<robot name="samplerobot">  
</robot>
```

- ▶ 2<sup>nd</sup>-level structure

`link`, `joints`, `sensors`, `transmissions`, `gazebo`, `model_state`

- ▶ 3<sup>rd</sup>-level structure

`visual`, `inertia`, `collision`, `origin`, `parent`, ...

- ▶ 4<sup>th</sup>-level structure

⋮



```
<link name="sample_link">
  <!-- describes the mass and inertial properties of
    the link -->
  <inertial/>

  <!-- describes the visual appearance of the link.
    can be describe using geometric primitives or
    meshes -->
  <visual/>

  <!-- describes the collision space of the link.
    is described like the visual appearance -->
  <collision/>
</link>
```

## Geometric primitives for describing visual appearance of the link

```
<link name="base_link">
  <visual>
    <origin xyz="0 0 0.01" rpy="0 0 0"/>
    <geometry>
      <box size="0.2 0.2 0.02"/>
    </geometry>
    <material name="cyan">
      <color rgba="0 1.0 1.0 1.0"/>
    </material>
  </visual>
</link>
```

- ▶ Geometric primitives: `<box>`, `<cylinder>`, `<sphere>`
- ▶ Materials: `<color>`, `<texture>`

## 3D meshes for describing visual appearance of the link

```
<link name="base_link">
  <visual>
    <origin xyz="0 0 0.01" rpy="0 0 0"/>
    <geometry>
      <mesh filename="meshes/base_link.dae"
    </geometry>
  </visual>
</link>
```

- ▶ the `<collision>` element is described identically to the `<visual>` element
- ▶ an additional `<collision_checking>` primitive can be used to approximate

Parameters describing the physical properties of the link

```
<link name="base_link">
  <inertial>
    <origin xyz="0 0 0" rpy="0 0 0"/>
    <mass value="1">
      <inertia ixx="100" ixy="0" ixz="0"
              iyy="100" iyz="0" izz="100" />
    </inertial>
  </link>
```

- ▶ center of gravity `<origin xyz>`
- ▶ object mass `<mass value>`
- ▶ inertia tensor `<intertia>`



Inertial tensor describes the dynamic physical properties of the link

- ▶ orientation and position of the inertia CS described by `<origin>` tag
- ▶ tensor is a symmetric  $3 \times 3$  matrix
- ▶ diagonal values describe main inertial axes `ixx`, `iyy`, `izz`
- ▶ `ixy`, `ixz`, `iyz` are 0 for geometric primitives
- ▶ rotations around largest and smallest inertial axis are most stable

```
<joint name="base_link_to_cyl" type="revolute">
  <!-- describes joint position and orientation -->
  <origin xyz="0 0 0.07" rpy="0 0 0"/>

  <!-- describes the related links -->
  <parent link="base_link"/>
  <child link="base_cyl"/>

  <!-- describes the axis of rotation-->
  <axis xyz="0 0 1"/>

  <!-- describes the joint limits-->
  <limit velocity="1.5707963267"
        lower="-3.1415926535" upper="3.1415926535"/>
</joint>
```



**type** `revolute`, `continuous`, `prismatic`, `fixed`,  
`floating`, `planar`

**parent\_link** link which the joint is connected to

**child\_link** link which is connected to the joint

**axis** joint axis relative to the joint CS. Represented  
using a normalized vector

**limit** joint limits for motion (**lower**, **upper**),  
**velocity** and **effort**

**dynamics** damping, friction

**calibration** rising, falling

**mimic** joint, multiplier, offset

**safety\_controller** `soft_lower_limit`, `soft_upper_limit`,  
`k_position`, `k_velocity`



- ▶ sensor
  - ▶ position and orientation relative to link
  - ▶ sensor properties
    - ▶ update rate
    - ▶ resolution
    - ▶ minimum / maximum angle
- ▶ transmissions
  - ▶ relation of motor to joint motion
- ▶ gazebo
  - ▶ simulation properties
- ▶ model state
  - ▶ description of different robot configurations

## Complex Hierachy

Full URDF hierarchy of the TAMS PR2 with the Shadow Hand.





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- Analytical solvability of manipulator

- Example: a planar 3 DOF manipulator

- The algebraical solution using the example of PUMA 560

- The solution for Orientation of PUMA560

- Solution for arm configurations

- Technical difficulties during the development of control software

- A Framework for robots under UNIX: RCCL

Differential motion with homogeneous transformations

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# Outline (cont.)

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## Set of problems

- ▶ In the majority of cases the control of robot manipulators takes place in the *joint space*,
- ▶ The informations about objects are mostly given in the *cartesian space*.

For getting a specific tool frame  $T$  related to the world, joint values  $\theta(t) = (\theta_1(t), \theta_2(t), \dots, \theta_n(t))^T$  should be calculated in two steps:

1. Calculation of  $T_6 = Z^{-1}BGE^{-1}$ ;
2. Calculation of  $\theta_1, \theta_2, \dots, \theta_n$  via  $T_6$ .

$\implies$  In this case the inverse kinematics is more important than the forward kinematics.



# The solution using the example of PUMA 560

$$T_6 = T' T'' = \begin{bmatrix} n_x & o_x & a_x & p_x \\ n_y & o_y & a_y & p_y \\ n_z & o_z & a_z & p_z \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

where

$$n_x = C_1[C_{23}(C_4 C_5 C_6 - S_4 S_6) - S_{23} S_5 C_6] - S_1(S_4 C_5 C_6 + C_4 S_6) \quad (11)$$

$$n_y = S_1[C_{23}(C_4 C_5 C_6 - S_4 S_6 - S_{23} S_5 S_6) + C_1(S_4 C_5 C_6 + C_4 S_6)] \quad (12)$$

$$n_z = -S_{23}[C_4 C_5 C_6 - S_4 S_6] - C_{23} S_5 C_6 \quad (13)$$



# The solution using the example of PUMA 560 (cont.)

$$o_x = \dots \quad (14)$$

$$o_y = \dots \quad (15)$$

$$o_z = \dots \quad (16)$$

$$a_x = \dots \quad (17)$$

$$a_y = \dots \quad (18)$$

$$a_z = \dots \quad (19)$$

$$p_x = C_1[d_6(C_{23}C_4S_5 + S_{23}C_5) + S_{23}d_4 + a_3C_{23} + a_2C_2] - S_1(d_6S_4S_5 + d_2) \quad (20)$$

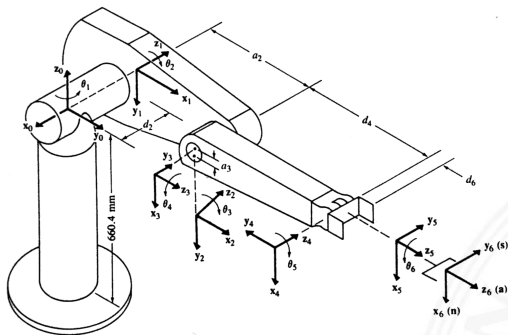
$$p_y = S_1[d_6(C_{23}C_4S_5 + S_{23}C_5) + S_{23}d_4 + s_3C_{23} + a_2C_2] + C_1(d_6S_4S_5 + d_2) \quad (21)$$

$$p_z = d_6(C_{23}C_5 - S_{23}C_4S_5) + C_{23}d_4 - a_3S_{23} - a_2S_2 \quad (22)$$



- ▶ Non-linear equations
- ▶ Existence of solutions  
Workspace: the volume of space that is reachable for the tool of the manipulator.
  - ▶ dexterous workspace
  - ▶ reachable workspace
- ▶ Many joint positions produce a similar TCP position using the example of PUMA 560
  - ▶ Ambiguity of solutions for  $\theta_1, \theta_2, \theta_3$  related to given  $\mathbf{p}$ .
  - ▶ For each solution of  $\theta_4, \theta_5, \theta_6$  the alternative solution exists





$$\theta'_4 = \theta_4 + 180^\circ$$

$$\theta'_5 = -\theta_5$$

$$\theta'_6 = \theta_6 + 180^\circ$$

- ▶ Different solution strategy: closed solutions vs. numerical solutions

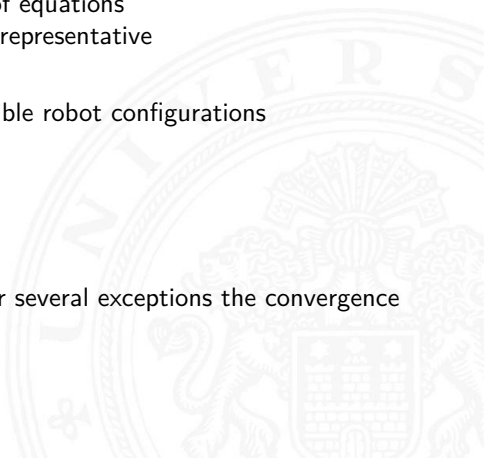


Closed form (analytical):

- ▶ algebraic solution
  - + accurate solution by means of equations
  - solution is not geometrically representative
- ▶ geometrical solution
  - + case-by-case analysis of possible robot configurations
  - robot specific

Numerical form:

- ▶ iterative methods
  - + the methods are transferable
  - computationally intensive, for several exceptions the convergence can not be guaranteed





## Solvability

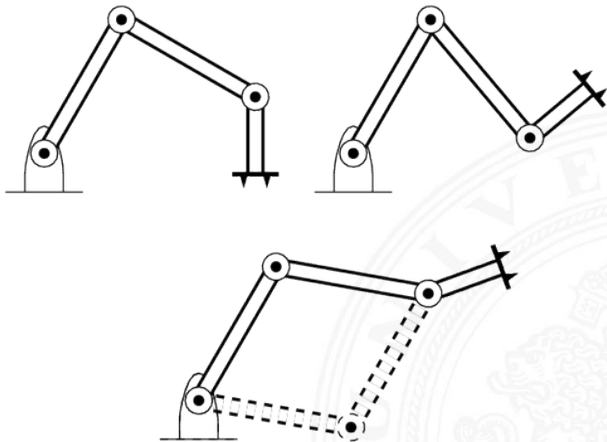
"The inverse kinematics for all systems with 6 DOF (translational or rotational joints) in a simple serial chain is always numerical solvable."

The closed solution exists if specific constraints (sufficient constraints) for the arm geometry are satisfied:

If 3 sequent axes intersect in a given point  
or if 3 sequent axes are parallel to each other

- ▶ manipulators should be designed regarding these constraints
- ▶ most of them are
  - ▶ PUMA 560: axes 4, 5 & 6 intersect in a single point
  - ▶ Mitsubishi PA10, KUKA LWR, PR2
  - ▶ 3-DOF planar (RPC)

# Example: a planar 3 DOF manipulator



# Example: a planar 3 DOF manipulator (cont.)

Joint	$\alpha_{i-1}$	$a_{i-1}$	$d_i$	$\theta_i$
1	0	0	0	$\theta_1$
2	0	$l_1$	0	$\theta_2$
3	0	$l_2$	0	$\theta_3$

$$T_6 = {}^0T_3 = \begin{bmatrix} C_{123} & -S_{123} & 0 & l_1 C_1 + l_2 C_{12} \\ S_{123} & C_{123} & 0 & l_1 S_1 + l_2 S_{12} \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

# The algebraical solution for the 3 DOF planar

Specification for the TCP:  $(x, y, \phi)$ . For such kind of vectors applies:

$${}^0T_3 = \begin{bmatrix} C_\phi & -S_\phi & 0 & x \\ S_\phi & C_\phi & 0 & y \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

Resultant, four equations can be derived:

$$C_\phi = C_{123} \quad (23)$$

$$S_\phi = S_{123} \quad (24)$$

$$x = l_1 C_1 + l_2 C_{12} \quad (25)$$

$$y = l_1 S_1 + l_2 S_{12} \quad (26)$$

# The algebraical solution for the 3 DOF planar (cont.)

We define the function  $atan2_m$  as:

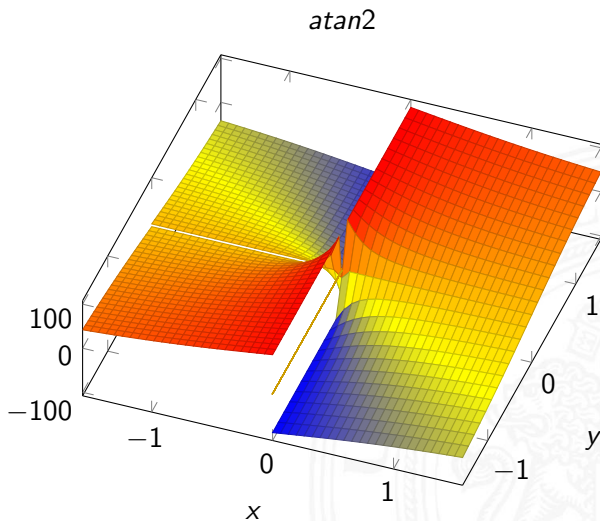
$$\theta = atan2(y, x) = \begin{cases} atan(\frac{y}{x}) & \text{for } +x \\ atan(\frac{y}{x}) + \pi & \text{for } -x, +y_0 \\ atan(\frac{y}{x}) - \pi & \text{for } -x, -y \\ \frac{\pi}{2} & \text{for } x = 0, +y \\ \frac{-\pi}{2} & \text{for } x = 0, -y \\ NaN & \text{for } x = 0, y = 0 \end{cases}$$



# The algebraical solution for the 3 DOF planar (cont.)

Inverse Kinematics for Manipulators - Example: a planar 3 DOF manipulator

Introduction to Robotics



# The algebraical solution for the 3 DOF planar (cont.)

Square and add (25) ( $x = l_1 C_1 + l_2 C_{12}$ ) and (26) ( $y = l_1 S_1 + l_2 S_{12}$ )

$$x^2 + y^2 = l_1^2 + l_2^2 + 2l_1 l_2 C_2$$

using

$$C_{12} = C_1 C_2 - S_1 S_2, S_{12} = C_1 S_2 + S_1 C_2$$

giving

$$C_2 = \frac{x^2 + y^2 - l_1^2 - l_2^2}{2l_1 l_2}$$

for goal in workspace

$$S_2 = \pm \sqrt{1 - C_2^2}$$

solution

$$\theta_2 = \text{atan2}(S_2, C_2)$$

# The algebraical solution for the 3 DOF planar (cont.)

solve (25) ( $x = l_1 C_1 + l_2 C_{12}$ ) and (26) ( $y = l_1 S_1 + l_2 S_{12}$ ) for  $\theta_1$

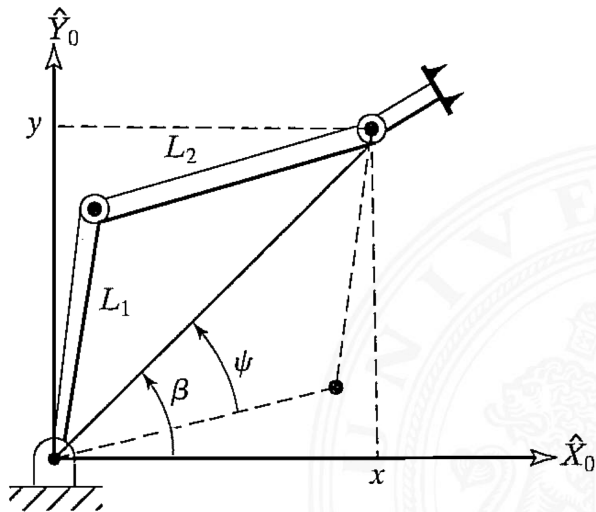
$$\theta_1 = \text{atan2}(y, x) - \text{atan2}(k_2, k_1)$$

where  $k_1 = l_1 + l_2 C_2$  and  $k_2 = l_2 S_2$ .

solve  $\theta_3$  from (23) ( $C_\phi = C_{123}$ ) and (24) ( $S_\phi = S_{123}$ )

$$\theta_1 + \theta_2 + \theta_3 = \text{atan2}(S_\phi, C_\phi) = \phi$$

# The geometrical solution for the example 1



# The geometrical solution for the example 1 (cont.)

Calculate  $\theta_2$  via the law of cosines:

$$x^2 + y^2 = l_1^2 + l_2^2 - 2l_1l_2 \cos(180 + \theta_2)$$

The solution:

$$\theta_2 = \pm \cos^{-1} \frac{x^2 + y^2 - l_1^2 - l_2^2}{2l_1l_2}$$

$$\theta_1 = \beta \pm \psi$$

where:

$$\beta = \text{atan2}_m(y, x), \quad \cos \psi = \frac{x^2 + y^2 - l_1^2 - l_2^2}{2l_1 \sqrt{x^2 + y^2}}$$

For  $\theta_1, \theta_2, \theta_3$  applies:

$$\theta_1 + \theta_2 + \theta_3 = \phi$$

# Algebraical solution (polynomial conversion)

The following substitutions are used for the polynomial conversion of transcendental equations:

$$u = \tan \frac{\theta}{2}$$

$$\cos \theta = \frac{1 - u^2}{1 + u^2}$$

$$\sin \theta = \frac{2u}{1 + u^2}$$

# Algebraical solution (polynomial conversion) (cont.)

Example:

The following transcendental equation is given:

$$a \cos \theta + b \sin \theta = c$$

After the polynomial conversion:

$$a(1 - u^2) + 2bu = c(1 + u^2)$$

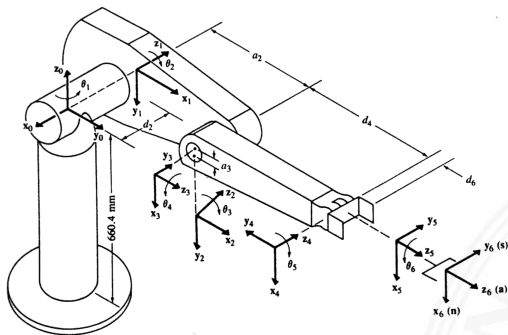
The solution for  $u$ :

$$u = \frac{b \pm \sqrt{b^2 - a^2 - c^2}}{a + c}$$

Then:

$$\theta = 2 \tan^{-1} \left( \frac{b \pm \sqrt{b^2 - a^2 - c^2}}{a + c} \right)$$

# The PUMA560



$$\theta'_4 = \theta_4 + 180^\circ$$

$$\theta'_5 = -\theta_5$$

$$\theta'_6 = \theta_6 + 180^\circ$$

- ▶ Different solution strategy: closed solutions vs. numerical solutions



## Calculation of $\theta_1, \theta_2, \theta_3$ :

The first three joint angles  $\theta_1, \theta_2, \theta_3$  affect the position of the TCP  $(p_x, p_y, p_z)^T$  (in case  $d_6 = 0$ ).

$$p_x = C_1[S_{23}d_4 + a_3C_{23} + a_2C_2] - S_1d_2 \quad (27)$$

$$p_y = S_1[S_{23}d_4 + a_3C_{23} + a_2C_2] + C_1d_2 \quad (28)$$

$$p_z = C_{23}d_4 - a_3S_{23} - a_2S_2 \quad (29)$$

The outcome of this is:

$$\theta_1 = \tan^{-1} \left( \frac{\mp p_y \sqrt{p_x^2 + p_y^2 - d_2^2} - p_x d_2}{\mp p_x \sqrt{p_x^2 + p_y^2 - d_2^2} + p_y d_2} \right)$$

# Algebraic solution using the PUMA 560 (cont.)

$$\theta_3 = \tan^{-1} \left( \frac{\mp A_3 \sqrt{A_3^2 + B_3^2 - D_3^2} + B_3 D_3}{\mp B_3 \sqrt{A_3^2 + B_3^2 - D_3^2} + A_3 D_3} \right)$$

where

$$A_3 = 2a_2a_3$$

$$B_3 = 2a_2d_4$$

$$D_3 = p_x^2 + p_y^2 + p_z^2 - a_2^2 - a_3^2 - d_2^2 - d_4^2$$

# Algebraic solution using the PUMA 560 (cont.)

and

$$\theta_2 = \tan^{-1} \left( \frac{\mp B_2 \sqrt{p_x^2 + p_y^2 - d_2^2} + A_2 p_z}{\mp A_2 \sqrt{p_x^2 + p_y^2 - d_2^2} + B_2 p_z} \right)$$

where

$$A_2 = d_4 C_3 - a_3 S_3$$

$$B_2 = -a_3 C_3 - d_4 S_3 - a_2$$

J. Craig, *Introduction to Robotics: Pearson New International Edition: Mechanics and Control*. Always learning, Pearson Education, Limited, 2013

# The solution for Orientation of PUMA560

$$T = R_{z,\phi} R_{y,\theta} R_{x,\psi}$$

The solution for following equation is sought:

$$R_{z,\phi}^{-1} T = R_{y,\theta} R_{x,\psi}$$

$$\begin{bmatrix} f_{11}(\mathbf{n}) & f_{21}(\mathbf{o}) & f_{31}(\mathbf{a}) & 0 \\ f_{12}(\mathbf{n}) & f_{22}(\mathbf{o}) & f_{32}(\mathbf{a}) & 0 \\ f_{13}(\mathbf{n}) & f_{23}(\mathbf{o}) & f_{33}(\mathbf{a}) & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} = \begin{bmatrix} C\theta & S\theta S\psi & S\theta C\psi & 0 \\ 0 & C\psi & -S\psi & 0 \\ -S\theta & C\theta S\psi & C\theta C\psi & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

where

$$f_{11} = C\phi x + S\phi y$$

$$f_{12} = -S\psi x + C\phi y$$

$$f_{13} = z$$



# The solution for Orientation of PUMA560 (cont.)

The equation for  $f_{12}(\mathbf{n})$  leads to:

$$-S\phi n_x + C\phi n_y = 0$$

$\Rightarrow$

$$\phi = \text{atan2}(n_y, n_x)$$

and

$$\phi = \phi + 180^\circ$$

The solution with the elements  $f_{13}$  and  $f_{11}$  are as appropriate:

$$-S\theta = n_z$$

# The solution for Orientation of PUMA560 (cont.)

and

$$C\theta = C\phi n_x + S\phi n_y$$

$\Rightarrow$

$$\theta = \text{atan2}(-n_z, C\phi n_x + S\phi a_y)$$

The solution with the elements  $f_{23}$  and  $f_{22}$  are as appropriate:

$$-S\psi = -S\phi a_x + C\phi a_y$$

$$C\psi = -S\phi o_x + C\phi o_y$$

$\Rightarrow$

$$\psi = \text{atan2}(S\phi a_x - C\phi a_y, -S\phi o_x + C\phi o_y)$$



## Definition of different arm configurations

**shoulder** RIGHT-arm, LEFT-arm

**elbow** ABOVE-arm, BELOW-arm

**wrist** WRIST-down, WRIST-up

# Solution for arm configurations (cont.)

Adapted from this following variable can be defined:

$$ARM = \begin{cases} +1 & \text{RIGHT-arm} \\ -1 & \text{LEFT-arm} \end{cases}$$

$$ELBOW = \begin{cases} +1 & \text{ABOVE-arm} \\ 1 & \text{BELOW-arm} \end{cases}$$

$$WRIST = \begin{cases} +1 & \text{WRIST-down} \\ -1 & \text{WRIST-up} \end{cases}$$

The complete solution for the inverse kinematics can be achieved by analysis of such arm configurations.



## Problem

- ▶ Software was hard-coded for a certain robot model / type.
- ▶ Software specialized on the robot skills and geometry
- ▶ Consequently, the extending and porting software to new hardware was difficult and time consuming

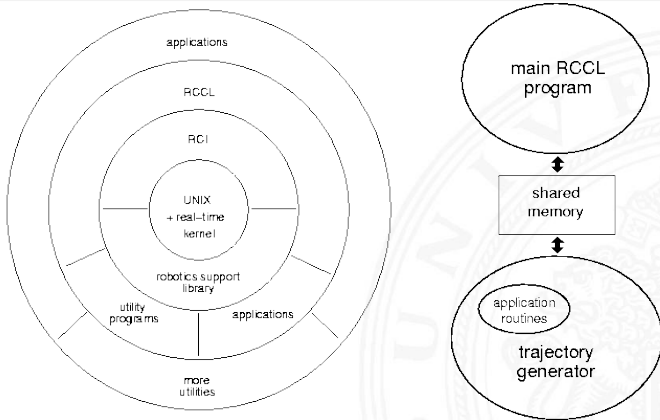
## Solution

Develop a control software with the following capabilities

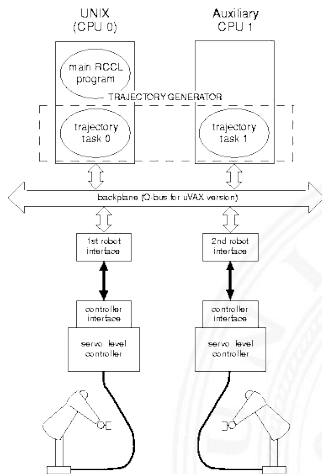
- ▶ Possibility to control low-level hardware properties
- ▶ Maximum portability to different platforms
- ▶ Maximum flexibility for fast programming of applications

## RCCL

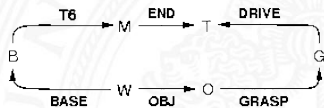
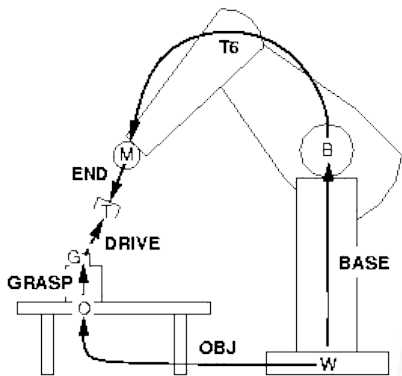
### Robot Control C Library



# Ability to control multiple robots



# Motion description with position equations



# Code sample for robot control in RCCL

```
#include <rccl.h>
#include "manex.560.h"

main()
{
    TRSF_PTR p, t;           /*#1*/
    POS_PTR pos;            /*#2*/
    MANIP *mnp;             /*#3*/
    JNTS rcclpark;         /*#4*/
    char *robotName;       /*#5*/

    rcclSetOptions (RCCL_ERROR_EXIT); /*#6*/
    robotName = getDefaultRobot();    /*#7*/
    if (!getRobotPosition (rcclpark.v, "rcclpark", robotName))
    { printf (''position 'rcclpark' not defined for robot\n'');
      exit(-1);
    }
    /*#8*/

    t = allocTransXyz ("T", UNDEF, -300.0, 0.0, 75.0);
    p = allocTransRot ("P", UNDEF, P_X, P_Y, P_Z, xunit, 180.0);
    pos = makePosition ("pos", T6, EQ, p, t, NULL); /*#9*/
}
```

# Code sample for robot control in RCCL (cont.)

```
    mnp = rcclCreate (robotName, 0);                               /*#10*/
    rcclStart();

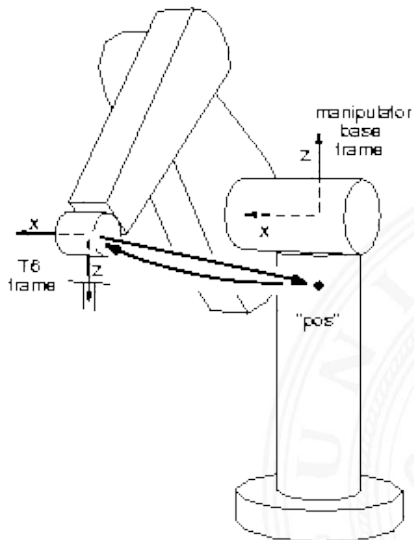
    movej (mnp, &rcclpark);                                       /*#11*/

    setMod (mnp, 'c');                                           /*#12*/
    move (mnp, pos);                                             /*#13*/
    stop (mnp, 1000.0);

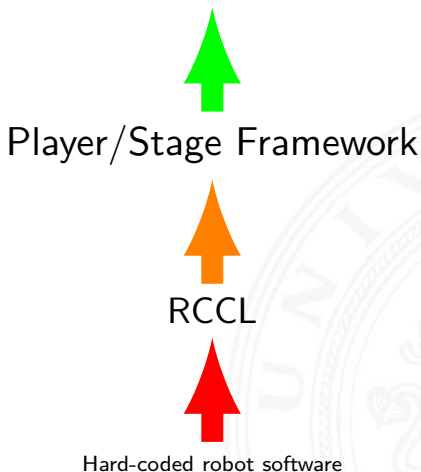
    movej (mnp, &rcclpark);                                       /*#14*/
    stop (mnp, 1000.0);

    waitForCompleted (mnp);                                       /*#15*/
    rcclRelease (YES);                                           /*#16*/
}
```

# Code sample for robot control in RCCL (cont.)



## Robot Operating System (ROS)







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Department of Informatics



# Introduction to Robotics

## Lecture 4

**Lasse Einig, Jianwei Zhang**

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University of Hamburg  
Faculty of Mathematics, Informatics and Natural Sciences  
Department of Informatics

Technical Aspects of Multimodal Systems

July 12, 2018



Introduction

Coordinate systems

Kinematic Equations

Robot Description

Inverse Kinematics for Manipulators

Differential motion with homogeneous transformations

- Differential translation and rotation

- Differential homogeneous transformation

- Differential rotation around the  $x, y, z$  axes

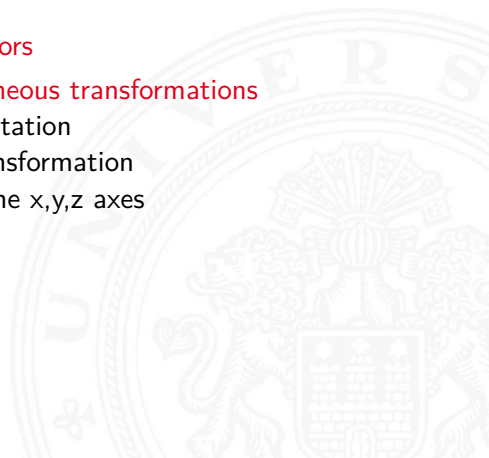
Jacobian

Trajectory planning

Trajectory generation

Dynamics

Principles of Walking





# Outline (cont.)

Differential motion with homogeneous transformations

Introduction to Robotics

Robot Control

Task-Level Programming and Trajectory Generation

Task-level Programming and Path Planning

Task-level Programming and Path Planning

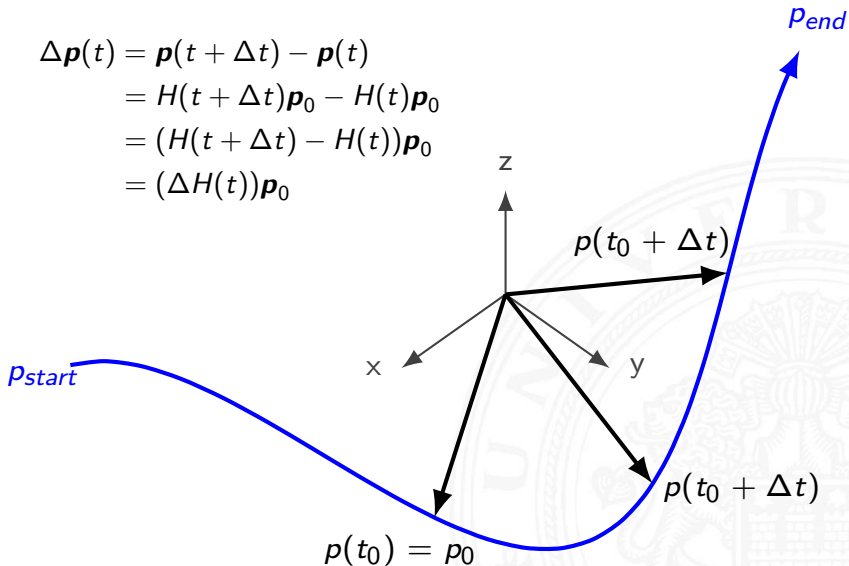
Architectures of Sensor-based Intelligent Systems

Summary

Conclusion and Outlook



$$\begin{aligned}\Delta \mathbf{p}(t) &= \mathbf{p}(t + \Delta t) - \mathbf{p}(t) \\ &= H(t + \Delta t)\mathbf{p}_0 - H(t)\mathbf{p}_0 \\ &= (H(t + \Delta t) - H(t))\mathbf{p}_0 \\ &= (\Delta H(t))\mathbf{p}_0\end{aligned}$$





$H$  is a  $4 \times 4$  homogeneous transformation from world-frame to object-frame and  $\mathbf{p}_0$  is given with reference to the world-frame.

Hence it is:

$$\dot{\mathbf{p}}(t) = \lim_{\Delta t \rightarrow 0} \frac{\Delta \mathbf{p}(t)}{\Delta t} \quad (30)$$

$$= \frac{dH(t)}{dt} \mathbf{p}_0 \quad (31)$$

$$= \left( \frac{dH(t)}{dt} H^{-1}(t) \right) H(t) \mathbf{p}_0 \quad (32)$$

$$= \left( \frac{dH(t)}{dt} H^{-1}(t) \right) \mathbf{p}(t) \quad (33)$$

# Derivative of a homogeneous transformation

Consider the homogeneous transformation  $H$

$$H = \begin{bmatrix} h_{11} & h_{12} & h_{13} & h_{14} \\ h_{21} & h_{22} & h_{23} & h_{24} \\ h_{31} & h_{32} & h_{33} & h_{34} \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

where each element is a function of a variable  $t$ :

$$dH = \begin{bmatrix} \frac{\partial h_{11}}{\partial t} & \frac{\partial h_{12}}{\partial t} & \frac{\partial h_{13}}{\partial t} & \frac{\partial h_{14}}{\partial t} \\ \frac{\partial h_{21}}{\partial t} & \frac{\partial h_{22}}{\partial t} & \frac{\partial h_{23}}{\partial t} & \frac{\partial h_{24}}{\partial t} \\ \frac{\partial h_{31}}{\partial t} & \frac{\partial h_{32}}{\partial t} & \frac{\partial h_{33}}{\partial t} & \frac{\partial h_{34}}{\partial t} \\ 0 & 0 & 0 & 1 \end{bmatrix} dt$$

**Case 1** The differential translation and rotation are executed with reference to a fixed coordinate frame.

$$H + dH = \text{Trans}_{dx,dy,dz} \text{Rot}_{k,d\theta} H \quad (34)$$

$\text{Trans}_{dx,dy,dz}$ : is a differential translation  $dx, dy, dz$  with reference to the fixed coordinate frame.

$\text{Rot}_{k,d\theta}$ : is a differential rotation  $d\theta$  around an arbitrary vector  $\mathbf{k}$  with reference to the fixed coordinate frame.

$dH$  is calculated as follows:

$$dH = (\text{Trans}_{dx,dy,dz} \text{Rot}_{k,d\theta} - I) H \quad (35)$$



**Case 2** The differential translation and rotation are executed with reference to a current object coordinate frame:

$$H + dH = H \text{Trans}_{dx,dy,dz} \text{Rot}_{k,d\theta} \quad (36)$$

$\text{Trans}_{dx,dy,dz}$ : is a differential translation  $dx, dy, dz$  with reference to the current object coordinate frame.

$\text{Rot}_{k,d\theta}$ : is a differential rotation  $d\theta$  around an arbitrary vector  $\mathbf{k}$  with reference to the current object coordinate frame.

$dH$  is calculated as follows:

$$dH = H (\text{Trans}_{dx,dy,dz} \text{Rot}_{k,d\theta} - I) \quad (37)$$



## Definition

$$\Delta = \text{Trans}_{dx,dy,dz} \text{Rot}_{k,d\theta} - I$$

Thus (35) can be written as

$$dH = \Delta \cdot H$$

and (37) can be written as:

$$dH = H \cdot \Delta$$

# Differential homogeneous transformation (cont.)

The translation by  $\mathbf{d}$  is defined as:

$$Trans_{\mathbf{d}} = \begin{bmatrix} 1 & 0 & 0 & d_x \\ 0 & 1 & 0 & d_y \\ 0 & 0 & 1 & d_z \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

where  $\mathbf{d}$  is a differential vector that represents the differential change

$$d_x \vec{i} + d_y \vec{j} + d_z \vec{k}$$

( $\vec{i}$ ,  $\vec{j}$ ,  $\vec{k}$  are three unit vectors coinciding with  $x, y, z$ ).

# Differential homogeneous transformation (cont.)

The transformation of the rotation with  $\theta$  around an arbitrary vector  $\mathbf{k} = k_x \vec{i} + k_y \vec{j} + k_z \vec{k}$  is defined as:

$$Rot_{\mathbf{k},\theta} = \begin{bmatrix} k_x k_x V\theta + C\theta & k_y k_x V\theta - k_z S\theta & k_z k_x V\theta + k_y S\theta & 0 \\ k_x k_y V\theta + k_z S\theta & k_y k_y V\theta + C\theta & k_z k_y V\theta - k_x S\theta & 0 \\ k_x k_z V\theta - k_y S\theta & k_y k_z V\theta + k_x S\theta & k_z k_z V\theta + C\theta & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \quad (38)$$

where  $C\theta = \cos \theta$ ,  $S\theta = \sin \theta$   
and  $V\theta = \text{versine } \theta = 2 \sin^2(\frac{\theta}{2}) = 1 - \cos \theta$ .

see R. Paul, *Robot Manipulators: Mathematics, Programming, and Control: the Computer Control of Robot Manipulators*. **Artificial Intelligence Series**, MIT Press, 1981, section 1.12 "General Rotation Transformation"

# Differential homogeneous transformation (cont.)

With:

$$\lim_{\theta \rightarrow 0} \sin \theta \rightarrow d\theta$$

$$\lim_{\theta \rightarrow 0} \cos \theta \rightarrow 1$$

$$\lim_{\theta \rightarrow 0} \text{vers} \theta \rightarrow 0$$

(38) can be written as:

$$\text{Rot}_{k,\theta} = \begin{bmatrix} 1 & -k_z d\theta & k_y d\theta & 0 \\ k_z d\theta & 1 & -k_x d\theta & 0 \\ -k_y d\theta & k_x d\theta & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \quad (39)$$

# Differential homogeneous transformation (cont.)

$$\Delta = \begin{bmatrix} 1 & 0 & 0 & d_x \\ 0 & 1 & 0 & d_y \\ 0 & 0 & 1 & d_z \\ 0 & 0 & 0 & 1 \end{bmatrix} \cdot \begin{bmatrix} 1 & -k_z d\theta & k_y d\theta & 0 \\ k_z d\theta & 1 & -k_x d\theta & 0 \\ -k_y d\theta & k_x d\theta & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} - \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \quad (40)$$

$$= \begin{bmatrix} 0 & -k_z d\theta & k_y d\theta & d_x \\ k_z d\theta & 0 & -k_x d\theta & d_y \\ -k_y d\theta & k_x d\theta & 0 & d_z \\ 0 & 0 & 0 & 0 \end{bmatrix} \quad (41)$$

# Differential rotation around the x,y,z axes

$$R_{x,\psi} = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & C\psi & -S\psi & 0 \\ 0 & S\psi & C\psi & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \quad (42)$$

Rotation matrices for rotations around x, y and z axis

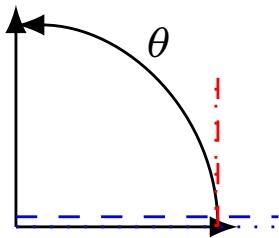
$$R_{y,\theta} = \begin{bmatrix} C\theta & 0 & S\theta & 0 \\ 0 & 1 & 0 & 0 \\ -S\theta & 0 & C\theta & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \quad (43)$$

$$R_{z,\phi} = \begin{bmatrix} C\phi & -S\phi & 0 & 0 \\ S\phi & C\phi & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \quad (44)$$

# Differential rotation around the x,y,z axes (cont.)

Considering the differential change:

$\sin\theta \rightarrow \delta\theta$  and  
 $\cos\theta \rightarrow 1$ .



$$R_{x,\delta_x} = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & -\delta_x & 0 \\ 0 & \delta_x & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \quad (45)$$

$$R_{y,\delta_y} = \begin{bmatrix} 1 & 0 & \delta_y & 0 \\ 0 & 1 & 0 & 0 \\ -\delta_y & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \quad (46)$$

$$R_{z,\phi} = \begin{bmatrix} 1 & -\delta_z & 0 & 0 \\ \delta_z & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \quad (47)$$

# Differential rotation around the x,y,z axes (cont.)

Omitting terms of the 2nd order, one gets:

$$R_{z,\delta_z} R_{y,\delta_y} R_{x,\delta_x} = \begin{bmatrix} 1 & -\delta_z & \delta_y & 0 \\ \delta_z & 1 & -\delta_x & 0 \\ -\delta_y & \delta_x & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \quad (48)$$

Through comparison of (39) with (48) one determines:

$$k_x d\theta = \delta_x \quad (49)$$

$$k_y d\theta = \delta_y \quad (50)$$

$$k_z d\theta = \delta_z \quad (51)$$



# Differential rotation around the x,y,z axes (cont.)

Equation (41) can be rewritten as:

$$\Delta = \begin{bmatrix} 0 & -\delta_z & \delta_y & d_x \\ \delta_z & 0 & -\delta_x & d_y \\ -\delta_y & \delta_x & 0 & d_z \\ 0 & 0 & 0 & 0 \end{bmatrix}$$

## Definition of differential transformation

$\Delta$  is therefore fully defined by the vectors  $\mathbf{d}$  and  $\delta$ .



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# Introduction to Robotics

## Lecture 5

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Faculty of Mathematics, Informatics and Natural Sciences  
Department of Informatics

**Technical Aspects of Multimodal Systems**

July 12, 2018

Introduction

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Jacobian of a Manipulator

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# Outline (cont.)

Jacobian

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## Definition

- ▶ A Jacobian-matrix is a multidimensional representation of partial derivatives.
- ▶ The Jacobian of a manipulator links the joint velocities with the cartesian velocity of the TCP.
- ▶ The Jacobian matrix depends on the current state of the robot joints.

# Jacobian of a Manipulator (cont.)

- ▶ Consider an n-link manipulator with joint variables  $q_1, q_2, \dots, q_n$ .
- ▶ Define  $q = [q_1, q_2, \dots, q_n]^T$
- ▶ Let the transformation from base to end-effector frame be:

$$T = \begin{bmatrix} R_n^0(q) & o(q) \\ 0 & 1 \end{bmatrix} \quad (52)$$

- ▶ We define  $\omega_n^0$  to be the angular velocity of the end-effector
- ▶ The linear velocity of the end-effector is  $v_n^0$
- ▶ The **Jacobian** matrix consists of two components, that solve the following equations:

$$v_n^0 = J_v \dot{q} \quad \text{and} \quad \omega_n^0 = J_w \dot{q}$$

## The manipulator Jacobian

$$J := \begin{bmatrix} J_v \\ J_w \end{bmatrix}$$

We define the body velocity of the endeffector:

$$\xi := \begin{bmatrix} v_n^0 \\ \omega_n^0 \end{bmatrix} := \begin{bmatrix} {}^T d_x \\ {}^T d_y \\ {}^T d_z \\ {}^T \delta_x \\ {}^T \delta_y \\ {}^T \delta_z \end{bmatrix} \quad \xi = J\dot{q}$$

## Revolute joints

If the  $i^{\text{th}}$  joint is revolute, the axis of rotation is given by  $z_{i-1}$ .

Let  $\omega_{i-1,i}^{i-1}$  represent the angular velocity of the link  $i$  w.r.t. the frame  $i-1$ .

Then, we have: 
$$\omega_{i-1,i}^{i-1} = \dot{q}_i z_{i-1}^{i-1}$$

## Prismatic joints

If the  $i^{\text{th}}$  joint is prismatic, the motion of frame  $i$  relative to frame  $i-1$  is a translation.

Then, we have: 
$$\omega_{i-1,i}^{i-1} = 0$$



# Angular Velocity Jacobian (cont.)

Overall angular velocity:

$$\omega_{0,n}^0 = \omega_{0,1}^0 + R_1^0 \omega_{1,2}^1 + \dots + R_{n-1}^0 \omega_{n-1,n}^{n-1} \quad (53)$$

We get:

$$\omega_{0,n}^0 = p_1 \dot{q}_1 z_0^0 + p_2 \dot{q}_2 R_1^0 z_1^1 + \dots + p_n \dot{q}_n R_{n-1}^0 z_{n-1}^{n-1} \quad (54)$$

$$= p_1 \dot{q}_1 z_0^0 + p_2 \dot{q}_2 z_1^0 + \dots + p_n \dot{q}_n z_{n-1}^0 \quad (55)$$

where:

$$p_i = \begin{cases} 0 & \text{if } i \text{ is prismatic} \\ 1 & \text{if } i \text{ is revolute} \end{cases} \quad (56)$$

# Angular Velocity Jacobian (cont.)

## The complete Jacobian

$$\begin{bmatrix} v_n^0 \\ \omega_n^0 \end{bmatrix} = \begin{bmatrix} J_v \\ J_w \end{bmatrix} \dot{q} \quad (57)$$

## The Angular Velocity Jacobian

$$J_w = [p_1 z_0^0 \quad p_2 z_1^0 \quad \dots \quad p_n z_{n-1}^0] \quad (58)$$

(Hint:  $J_w$  is a  $3 \times n$  matrix; due to matrix multiplication rules the representation is equal to those on the last slide.)



The linear velocity of the end effector is:  $\dot{o}_n^0$

By the chain rule of differentiation:

$$\dot{o}_n^0 = \frac{\delta o_n^0}{\delta q_1} \dot{q}_1 + \frac{\delta o_n^0}{\delta q_2} \dot{q}_2 + \dots + \frac{\delta o_n^0}{\delta q_n} \dot{q}_n \quad (59)$$

therefore the linear part of the Jacobian is:

$$J_v = \begin{matrix} \frac{\delta o_n^0}{\delta q_1} & \frac{\delta o_n^0}{\delta q_2} & \dots & \frac{\delta o_n^0}{\delta q_n} \end{matrix} \quad (60)$$



Every prismatic joint influences the velocity of the endeffector depending on:

- ▶ the current linear velocity of the joint ( $\dot{d}_i$ )
- ▶ the current orientation of the z-axis of the joint ( $z_{i-1}$ )
  - ▶ depending on  $q$

$$\dot{o}_n^0 = \dot{d}_i z_{i-1} \quad (61)$$

Therefore:

$$J_{v_i} = \frac{\delta o_n^0}{\delta q_n} = z_{i-1} \quad (62)$$

Every revolute joint influences the velocity of the end-effector depending on:

- ▶ the current angular velocity of the joint ( $\dot{q}_i$ )
- ▶ the current orientation of the z-axis of the joint ( $z_{i-1}$ )
- ▶ the current vector from the joint origin  $o_{i-1}$  to the end-effector
  - ▶ the two latter depending on  $q$

The linear velocity of the end-effector is of form:

$$\omega \times r$$

with  $\omega = \dot{q}_i z_{i-1}$  and  $r = o_n^0 - o_{i-1}^0$

Therefore:

$$J_{v_i} = \frac{\delta o_n^0}{\delta q_n} = z_{i-1} \times (o_n^0 - o_{i-1}^0) \quad (63)$$

$$J := \begin{bmatrix} J_v \\ J_w \end{bmatrix}$$

$$J_v = [J_{v_1} \quad J_{v_2} \quad J_{v_n}] \quad \text{with} \quad (64)$$

$$J_{v_i} = \begin{cases} z_{i-1} & \text{if } i \text{ is prismatic} \\ z_{i-1} \times (o_n^0 - o_{i-1}^0) & \text{if } i \text{ is revolute} \end{cases} \quad (65)$$

and  $J_w = [J_{w_1} \quad J_{w_2} \quad J_{w_n}]$  with (66)

$$J_{w_i} = \begin{cases} 0 & \text{if } i \text{ is prismatic} \\ z_{i-1} & \text{if } i \text{ is revolute} \end{cases} \quad (67)$$

# Computing the final Jacobian (cont.)

## Target

Compute  $z_i$  and  $o_i$ .

- ▶  $z_i$  is equal to the first three elements of the 3rd column of matrix  ${}^0T_i$
- ▶  $o_i$  is equal to the first three elements of the 4th column of matrix  ${}^0T_i$

${}^0T_i$  has to be computed for every joint.

# Jacobian of a Manipulator – DOF

Consider a Manipulator with 6 DOFs:

$$T_6 = A_1 A_2 A_3 A_4 A_5 A_6$$

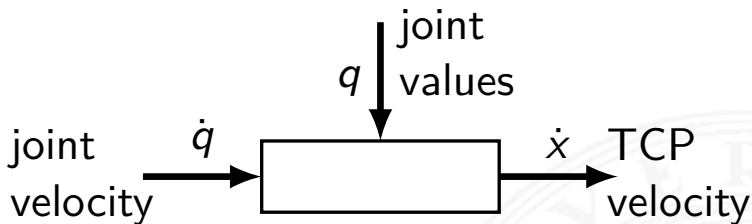
the Jacobian is:

$$\begin{bmatrix} T_6 d_x \\ T_6 d_y \\ T_6 d_z \\ T_6 \delta_x \\ T_6 \delta_y \\ T_6 \delta_z \end{bmatrix} = J_{6 \times 6} \begin{bmatrix} dq_1 \\ dq_2 \\ dq_3 \\ dq_4 \\ dq_5 \\ dq_6 \end{bmatrix}$$

$$\dot{\mathbf{x}} = J(\mathbf{q}) \dot{\mathbf{q}}$$

In case of a 6-DOF manipulator, we get a  $6 \times 6$  matrix.





## Question

Is the Jacobian invertible?

If it is, then:

$$\dot{q} = J^{-1}(q)\dot{x}$$

$\implies$  to move the the end-effector of the robot in Cartesian Space with a certain velocity.

For most manipulators there exist values of  $\mathbf{q}$  where the Jacobian gets **singular**.

## Singularity

$$\det J = 0 \implies J \text{ is not invertible}$$

Such configurations are called **singularities** of the manipulator.

Two Main types of Singularities:

- ▶ Workspace boundary singularities
- ▶ Workspace internal singularities

# Singular Configurations – Workarounds

- ▶ generally only for 6-DOF manipulators the Jacobian is invertible
  - ▶ there are workarounds for other types of manipulators
- $n < 6$  manually restrict the DOF of the end-effector  
⇒ square Jacobian matrix.

Example:

$$\begin{bmatrix} T_6 d_x \\ T_6 d_y \end{bmatrix} = J_{2 \times 2} \begin{bmatrix} dq_1 \\ dq_2 \end{bmatrix}$$

for a 2-joint planar manipulator

- $n > 6$  use the pseudoinverse of  $J$

$$A^+ = (A^T \cdot A)^{-1} \cdot A^T, \text{ linear independent columns} \quad (68)$$

$$A^+ = A^T \cdot (A^T \cdot A)^{-1}, \text{ linear independent rows} \quad (69)$$



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# Introduction to Robotics

## Lecture 6

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University of Hamburg  
Faculty of Mathematics, Informatics and Natural Sciences  
Department of Informatics

**Technical Aspects of Multimodal Systems**

July 12, 2018



Introduction

Coordinate systems

Kinematic Equations

Robot Description

Inverse Kinematics for Manipulators

Differential motion with homogeneous transformations

Jacobian

Trajectory planning

- Trajectory generation

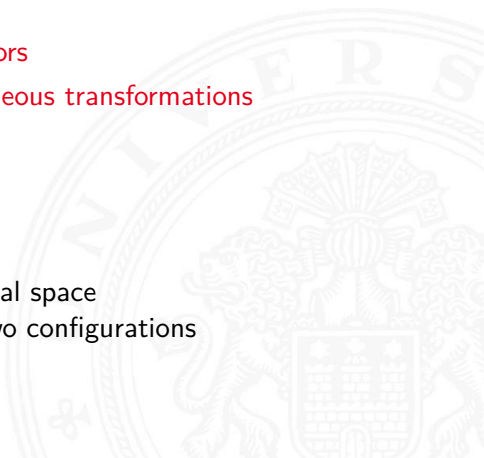
- Generation of trajectories

- Trajectories in multidimensional space

- Cubic polynomials between two configurations

- Optimizing motion

Trajectory generation





# Outline (cont.)

Trajectory planning

Introduction to Robotics

Dynamics

Principles of Walking

Robot Control

Task-Level Programming and Trajectory Generation

Task-level Programming and Path Planning

Task-level Programming and Path Planning

Architectures of Sensor-based Intelligent Systems

Summary

Conclusion and Outlook





## Definition

A trajectory is a time history of

**position,**  
**velocity** and  
**acceleration**

for each DOF

Describes motion of TCP frame relative to base frame

- ▶ abstract from joint configuration

Series of discrete poses (TCP or joint configuration)

- ▶ usually fixed temporal intervals
- ▶ possibly fixed distances, key frames



## Problem

I am at point A and want move to point B.

- ▶ How do I get to point B?
- ▶ How long does it take me to get to point B?
- ▶ Which constraints exist for moving from A to B?

## Solution

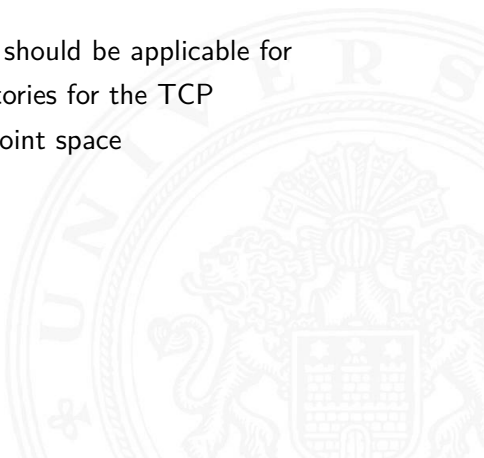
- ▶ generate a possible trajectory
- ▶ trajectory planning
- ▶ describe intermediate poses (waypoints)





The methods for path generation should be applicable for

- ▶ calculation of cartesian trajectories for the TCP
- ▶ calculation for trajectories in joint space



## Naive approach

Set the pose for the next time step (e.g. 10 ms later) to B.

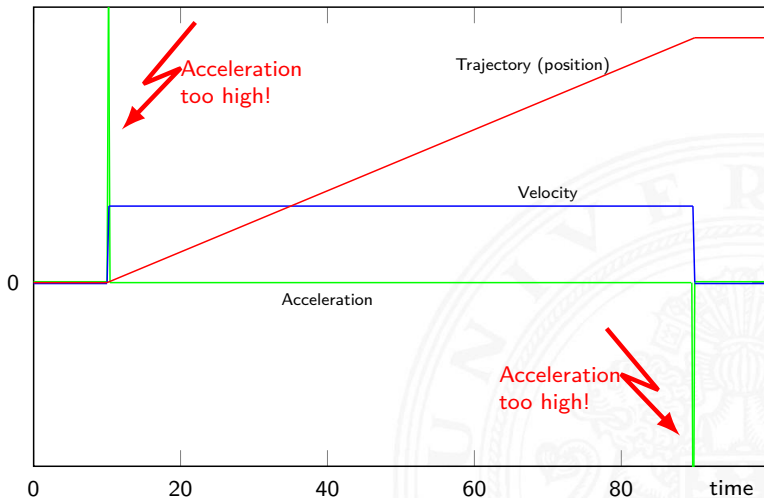
- ▶ possible only in simulation
- ▶ the moving distance for a manipulator at the next time step may be too large (velocity approaches  $\infty$ )



## Next best approach

- ▶ divide distance between A and B to shorter (sub-)distances
- ▶ use linear interpolation for these (sub-)distances
- ▶ respect the maximum velocity constraint

# Linear interpolation – visualization



## Problem

The physical constraints are violated

- ▶ joint velocity is limited by maximum motor rotation speed
- ▶ joint acceleration is limited by maximum motor torque

Implicitly these constraints are valid for motion in cartesian space.

- ▶ robot dynamics (joint moments resulting from the robot motion) affect the boundary condition

## Solution

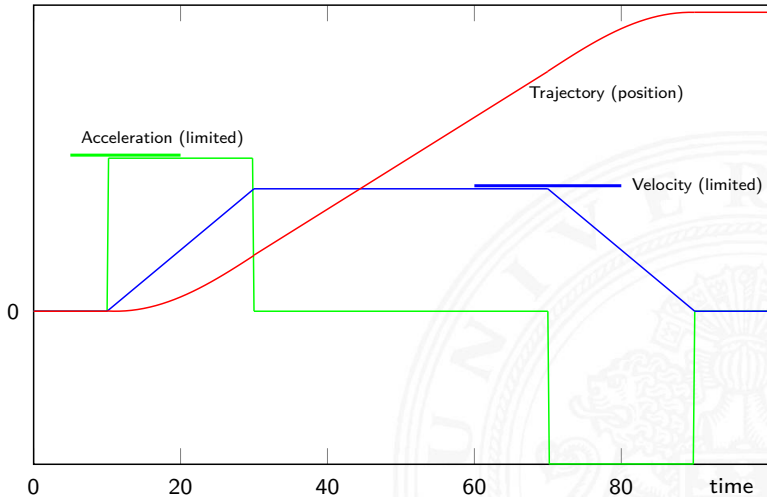
- ▶ dynamical trajectory planning
- ▶ advanced optimization methods → current topic of research



## Next best approach

- ▶ Limitation of joint velocity and acceleration
- ▶ Two different methods
  - ▶ trapezoidal interpolation
  - ▶ polynomial interpolation

# Trapezoidal interpolation – visualization





- ▶ consider joint velocity and acceleration constraints
- ▶ optimal time usage (move with maximum acceleration and velocity)
- ▶ acceleration is not differentiable (the jerk is not continuous)
- ▶ start and end velocity equals 0
  - ▶ not sensible for concatenating trajectories
  - ▶ improved by polynomial interpolation





## Problem

### Multidimensional trapezoidal interpolations

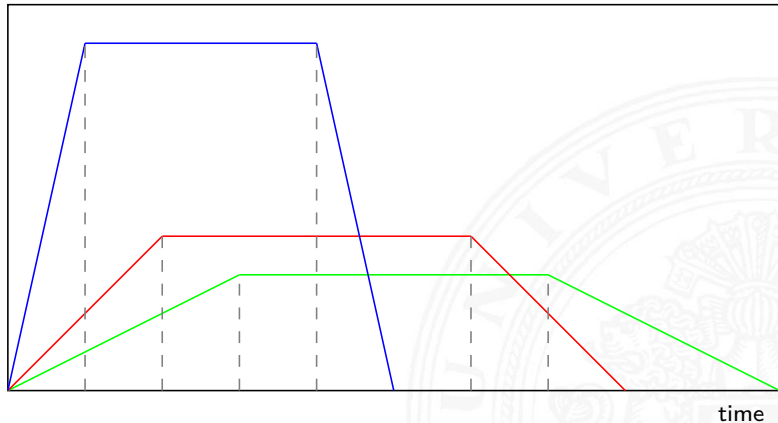
- ▶ different run time for joints (or cartesian dimensions)
- ▶ multiple velocity and acceleration constraints
- ▶ results in various time switch points
  - ▶ from acceleration to continuous velocity
  - ▶ from continuous velocity to deceleration
  - ▶ moving along a line in joint/cartesian space is impossible.

## Solution

- ▶ Normalization to the slowest joint
- ▶ Use jerk and arrival time of the slowest joint instead of velocity.

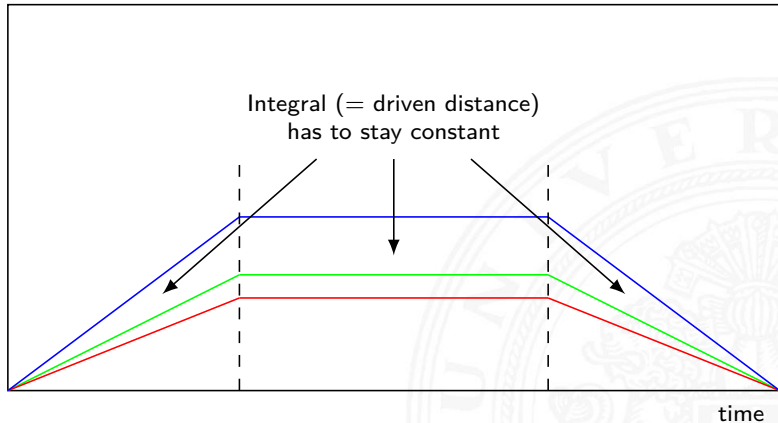
# Trapezoidal interpolation – normalization

Normalize to the slowest joint



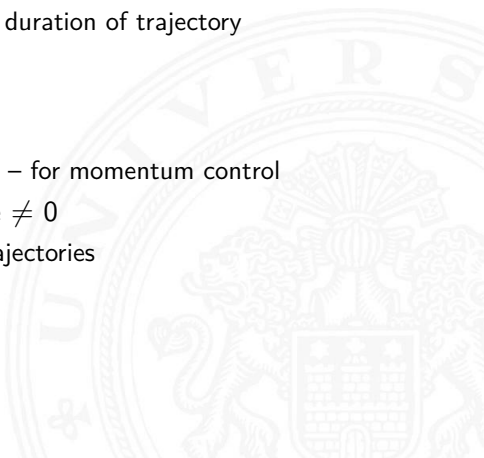
# Trapezoidal interpolation – normalization (cont.)

Normalize to the slowest joint





- ▶ Consider velocity and acceleration boundary conditions
  - ▶ calculation of extremum and duration of trajectory
- ▶ Acceleration differentiable
  - ▶ continuous jerk
  - ▶ smooth trajectory
  - ▶ interesting only in the theory – for momentum control
- ▶ Start and end velocity may be  $\neq 0$ 
  - ▶ sensible for concatenating trajectories





# Polynomial interpolation (cont.)

- ▶ Usually a polynomial with degree of 3 (cubic spline) or 5
- ▶ Calculation of coefficient with respect to boundary constraints
  - ▶ 3<sup>rd</sup>-degree polynomial: consider 4 boundary constraints
    - ▶ position and velocity; start and goal
  - ▶ 5<sup>th</sup>-degree polynomial: consider 6 boundary constraints
    - ▶ position, velocity and acceleration; start and goal

## Example 5<sup>th</sup>-degree

$$f(x) = a_0 + a_1x + a_2x^2 + a_3x^3 + a_4x^4 + a_5x^5$$

Boundary conditions for start ( $x = t_0$ ) and goal ( $x = t_d$ ):

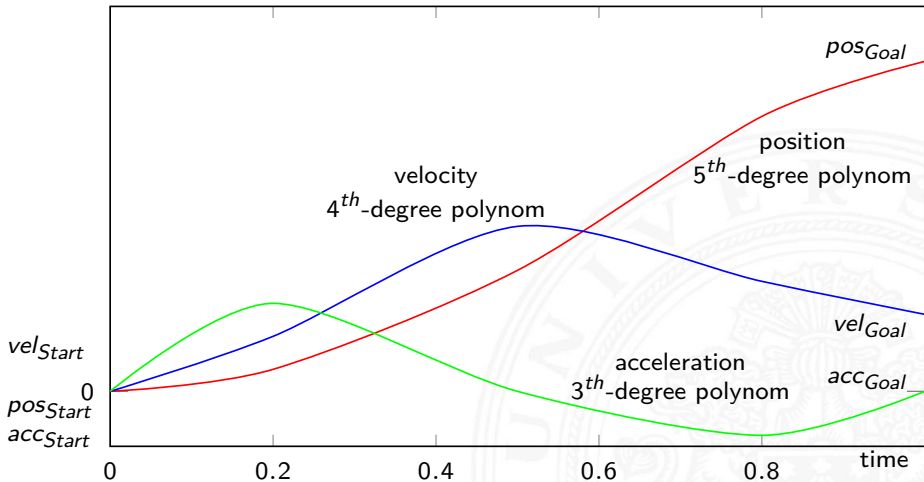
- ▶  $f(t_0) = pos_{Start}$ ,  $f(t_d) = pos_{Goal}$
- ▶  $f'(t_0) = vel_{Start}$ ,  $f'(t_d) = vel_{Goal}$
- ▶  $f''(t_0) = acc_{Start}$ ,  $f''(t_d) = acc_{Goal}$

$t$ : formal time from the interval  $[0;1]$

Proper position interpolation from start ( $A$ ) to goal ( $B$ )

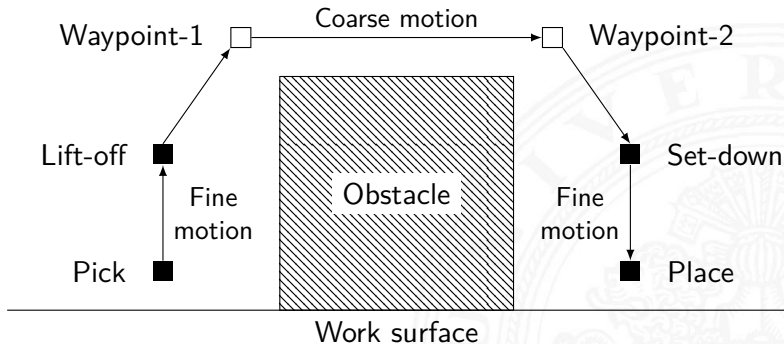
$$P(t) = Af(t) + Bf(1 - t)$$

# Polynomial interpolation (cont.)



# Boundary constraints

## Pick-and-Place example







# Boundary constraints (cont.)

## Pick-and-Place example

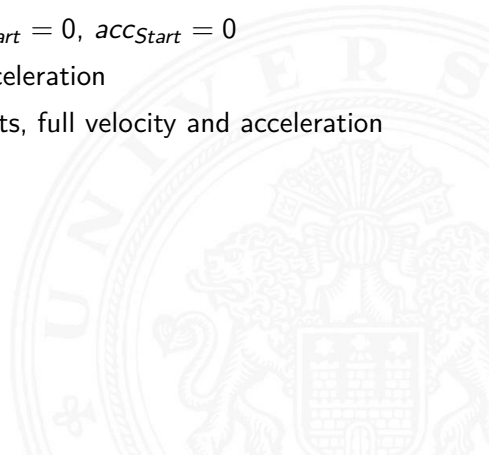
**Pick**  $pos_{Start} = object, vel_{Start} = 0, acc_{Start} = 0$

**Lift-off** limited velocity and acceleration

**Motion** continuous via waypoints, full velocity and acceleration

**Set-down** similar to Lift-off

**Place** similar to Pick



## Task

- ▶ find trajectory for moving the robot from start to goal pose
  - ▶ calculate
  - ▶ interpolate
  - ▶ approximate
- ▶ use continuous functions of time

## Solution:

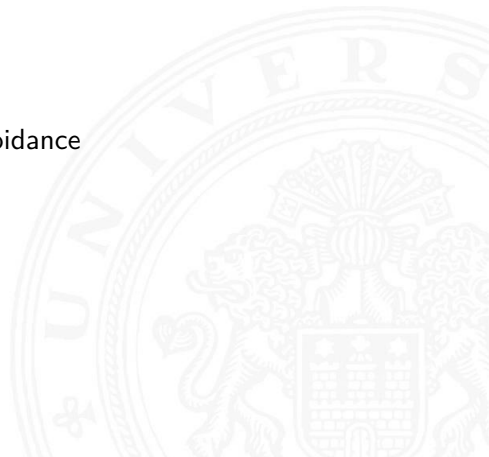
- ▶ Cartesian space
- ▶ Joint Space



# Generation of trajectories (cont.)

Cartesian space:

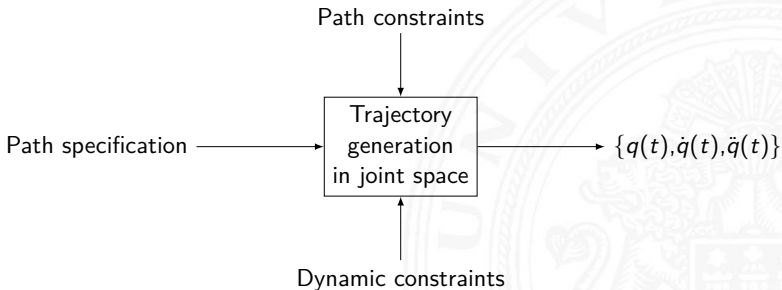
- ▶ near to the task specification
- ▶ advantageous for collision avoidance



# Generation of trajectories (cont.)

Joint space:

- ▶ no inverse kinematics in joint space required
- ▶ the planned trajectory can be immediately applied
- ▶ physical joint constraints can be considered





# Trajectories in multidimensional space

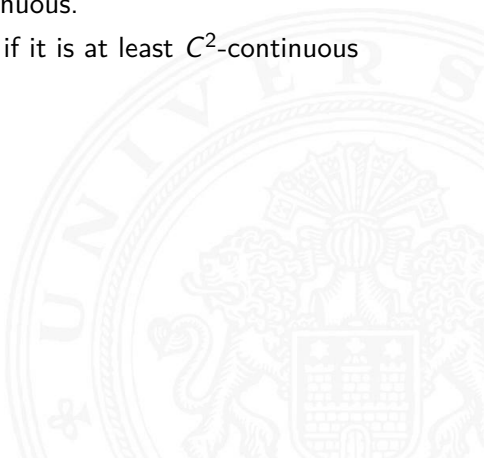
- ▶ Changes in position, velocity and acceleration of all joints are analyzed over a period of time
- ▶ Trajectory with  $n$  DOF is a parameterized function  $q(t)$  with values in its motion region.
- ▶ Trajectory  $q(t)$  of a robot with  $n$  DOF is then a vector of  $n$  parameterized functions  $q_i(t), i \in \{1 \dots n\}$  with one common parameter  $t$ :

$$q(t) = [q_1(t), q_2(t), \dots, q_n(t)]^T$$



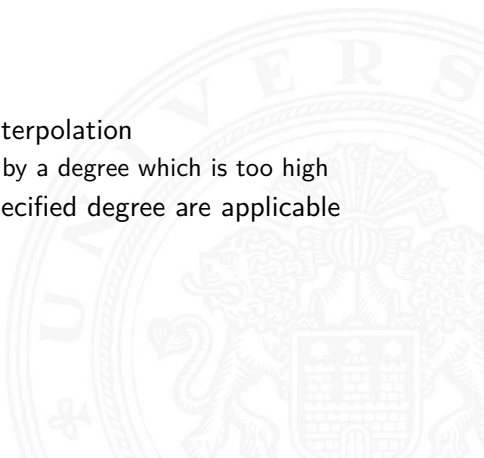
# Continuity of Trajectories

- ▶ A trajectory is  $C^k$ -continuous, if all derivatives up to the  $k$ -th (including) exist and are continuous.
- ▶ A trajectory is called *smooth*, if it is at least  $C^2$ -continuous
- ▶  $q(x)$  is the trajectory,
- ▶  $\dot{q}(x)$  is the velocity,
- ▶  $\ddot{q}(x)$  is the acceleration,
- ▶  $\dddot{q}(x)$  is the jerk





- ▶ The smoothest curves are generated by infinitely often differentiable functions.
  - ▶  $e^x$
  - ▶  $\sin(x)$ ,  $\cos(x)$
  - ▶  $\log(x)$  (for  $x > 0$ )
  - ▶ ...
- ▶ Polynomials are suitable for interpolation
  - ▶ Problem: oscillations caused by a degree which is too high
- ▶ Piecewise polynomials with specified degree are applicable
  - ▶ cubic polynomial
  - ▶ splines
  - ▶ B-Splines
  - ▶ ...





# Cubic polynomials between two configurations

- ▶ third-degree polynomial  $\Rightarrow$  four constraints:

$$\theta(t) = a_0 + a_1t + a_2t^2 + a_3t^3$$

- ▶ if the start and end velocity is 0 then

$$\theta(0) = \theta_0 \tag{70}$$

$$\theta(t_f) = \theta_f \tag{71}$$

$$\dot{\theta}(0) = 0 \tag{72}$$

$$\dot{\theta}(t_f) = 0 \tag{73}$$



# Cubic polynomials between two configurations (cont.)

► The solution

$$\text{eq. (70)} \quad a_0 = \theta_0$$

$$\text{eq. (72)} \quad a_1 = 0$$

$$a_2 = \frac{3}{t_f^2}(\theta_f - \theta_0)$$

$$a_3 = -\frac{2}{t_f^3}(\theta_f - \theta_0)$$

# Cubic polynomials with waypoints and velocities

- ▶ Similar to the previous example:
  - ▶ positions of waypoints are given (same)
  - ▶ velocities of waypoints are different from 0 (different)

$$\theta(0) = \theta_0 \quad (74)$$

$$\theta(t_f) = \theta_f \quad (75)$$

$$\dot{\theta}(0) = \dot{\theta}_0 \quad (76)$$

$$\dot{\theta}(t_f) = \dot{\theta}_f \quad (77)$$

# Cubic polynomials with waypoints and velocities (cont.)

► The solution

$$\text{eq. (74)} \quad a_0 = \theta_0$$

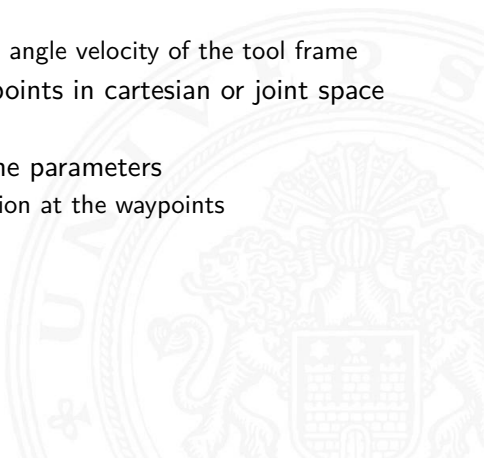
$$\text{eq. (76)} \quad a_1 = \dot{\theta}_0$$

$$a_2 = \frac{3}{t_f^2}(\theta_f - \theta_0) - \frac{2}{t_f}\dot{\theta}_0 - \frac{1}{t_f}\dot{\theta}_f$$

$$a_3 = -\frac{2}{t_f^3}(\theta_f - \theta_0) + \frac{1}{t_f^2}(\dot{\theta}_f + \dot{\theta}_0)$$



- ▶ Manually specify waypoints
  - ▶ based on cartesian linear and angle velocity of the tool frame
- ▶ Automatic calculation of waypoints in cartesian or joint space
  - ▶ based on heuristics
- ▶ Automatic determination of the parameters
  - ▶ based on continuous acceleration at the waypoints



# Factors for time optimal motion – Arc Length

If the curve in the  $n$ -dimensional  $K$  space is given by

$$\mathbf{q}(t) = [q^1(t), q^2(t), \dots, q^n(t)]^T$$

then the **arc length** can be defined as follows:

$$s = \int_0^t \|\dot{\mathbf{q}}(t)\|_2 dt$$

where  $\|\dot{\mathbf{q}}(t)\|_2$  is the euclidean norm of vector  $d\mathbf{q}(t)/dt$  and is labeled as a flow velocity along the curve.

$$\|\mathbf{x}\|_2 := \sqrt{x_1^2 + \dots + x_n^2}$$

# Factors for time optimal motion – Arc Length (cont.)

With the following two points given

$\mathbf{p}_0 = \mathbf{q}(t_s)$  und  $\mathbf{p}_1 = \mathbf{q}(t_f)$ ,

the arc length  $L$  between  $\mathbf{p}_0$  and  $\mathbf{p}_1$  is the integral:

$$L = \int_{\mathbf{p}_1}^{\mathbf{p}_0} ds = \int_{t_s}^{t_f} \|\dot{\mathbf{q}}(t)\|_2 dt$$

*“The trajectory parameters should be calculated in the way that the arc length  $L$  under the given constraints has the shortest possible value.”*

# Factors for time optimal motion – Arc Length (cont.)

- ▶ trajectory of circle

$$q(t) = c(t) = [r \cos(t), r \sin(t)]^T$$

- ▶ arc length  $L$  of circle (circumference)

$$L = \int_0^{2\pi} \|\dot{c}(t)\|_2 dt \quad (78)$$

$$= \int_0^{2\pi} \left\| \begin{bmatrix} -r \sin(t) \\ r \cos(t) \end{bmatrix} \right\|_2 dt \quad (79)$$

$$= \int_0^{2\pi} \sqrt{r^2(\sin^2(t) + \cos^2(t))} dt \quad (80)$$

$$= \int_0^{2\pi} r dt \quad (81)$$

$$L = 2\pi r \quad (82)$$

## Curvature

Defines the sharpness of a curve. A straight line has zero curvature. Curvature of large circles is smaller than of small circles.

At first the *unit vector* of a curve  $\mathbf{q}(t)$  can be defined as

$$\mathbf{U} = \frac{d\mathbf{q}(t)}{ds} = \frac{d\mathbf{q}(t)/dt}{ds/dt} = \frac{\dot{\mathbf{q}}(t)}{|\dot{\mathbf{q}}(t)|}$$

If  $s$  is the parameter of the *arc length* and  $\mathbf{U}$  as the *unit vector* is given, the **curvature** of curve  $\mathbf{q}(t)$  can be defined as

$$\kappa(s) = \left| \frac{d\mathbf{U}}{ds} \right|$$



# Factors for time optimal motion – Curvature (cont.)

$$\text{with } \kappa(s) = \left| \frac{d\mathbf{U}}{ds} \right| \rightarrow \text{curvature}$$

If the parameter  $t$ , the first derivative  $\dot{\mathbf{q}} = d\mathbf{q}(t)/dt$  and the second derivative  $\ddot{\mathbf{q}} = d\dot{\mathbf{q}}(t)/dt$  for the curve  $\mathbf{q}(t)$  are given, then the *curvature* can be calculated from the following representation

$$\kappa(t) = \frac{|\dot{\mathbf{q}} \times \ddot{\mathbf{q}}|}{|\dot{\mathbf{q}}|^3} = \frac{(\dot{\mathbf{q}}^2 \cdot \ddot{\mathbf{q}}^2 - (\dot{\mathbf{q}} \cdot \ddot{\mathbf{q}})^2)^{1/2}}{|\dot{\mathbf{q}}|^3}$$

where  $\dot{\mathbf{q}} \times \ddot{\mathbf{q}}$  is the cross product and  $\dot{\mathbf{q}} \cdot \ddot{\mathbf{q}}$  is the dot product

# Factors for time optimal motion – Curvature (cont.)

with  $q(t) = c(t) = [r \cos(t), r \sin(t)]^T \rightarrow$  trajectory of a circle

$$\dot{c}(t) = [-r \sin(t), r \cos(t)]^T$$

$$\ddot{c}(t) = [-r \cos(t), -r \sin(t)]^T$$

$$\dot{c}^2(t) = r^2 \sin^2(t) + r^2 \cos^2(t) = r^2$$

$$\ddot{c}^2(t) = r^2 \cos^2(t) + r^2 \sin^2(t) = r^2$$

$$\dot{c}(t) \cdot \ddot{c}(t) = r^2 \sin(t) \cos(t) - r^2 \cos(t) \sin(t) = 0$$

## Curvature of a circle

$$\kappa(t) = \frac{(\dot{c}^2 \cdot \ddot{c}^2 - (\dot{c} \cdot \ddot{c})^2)^{1/2}}{|\dot{c}|^3} = \frac{\sqrt{r^4}}{r^3} = \frac{1}{r}$$

# Factors for time optimal motion – Bending Energy

The **bending energy** of a smooth curve  $\mathbf{q}(t)$  over the interval  $t \in [0, T]$  is defined as

$$E = \int_0^L \kappa(s)^2 ds = \int_0^T \kappa(t)^2 |\dot{\mathbf{q}}(t)| dt$$

where  $\kappa(t)$  is the curvature of  $\mathbf{q}(t)$ .

*“The bending energy  $E$  of a trajectory should be as small as possible under consideration of the arc length.”*

# Factors for time optimal motion – Motion Time

If a motion consists of  $n$  successive segments

$$q_j, j \in \{1 \dots n\}$$

then

$$u_j = t_{j+1} - t_j$$

is the required time for the motion in the segment  $q_j$ . The total motion time is

$$T = \sum_{j=1}^{n-1} u_j$$

The borders for the minimum motion time  $T_{min}$  for the trajectory  $\mathbf{q}_j^i(t)$  are defined over dynamical parameters of all joints.

For joint  $i \in \{1 \dots n\}$  of trajectory part  $j \in \{1 \dots m\}$  this kind of constraint can be described as follows

$$|\dot{q}_j^i(t)| \leq \dot{q}_{max}^i \quad (83)$$

$$|\ddot{q}_j^i(t)| \leq \ddot{q}_{max}^i \quad (84)$$

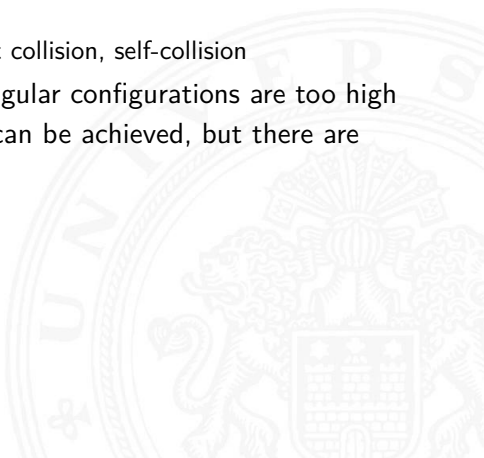
$$|m_j^i(t)| \leq m_{max}^i \quad (85)$$

- ▶  $m^i$  is the torque (moment of force) for the joint  $i$  and can be calculated from the dynamical equation (motion equation).
- ▶  $\dot{q}_{max}^i$ ,  $\ddot{q}_{max}^i$  and  $m_{max}^i$  represent the important parameters of the dynamical capacity of the robot.



# Difficulties for cartesian space trajectory generation

- ▶ Waypoints cannot be realized
  - ▶ workspace boundaries, object collision, self-collision
- ▶ Velocities in the vicinity of singular configurations are too high
- ▶ Start and end configurations can be achieved, but there are different solutions
  - ▶ ambiguous solutions



# Motion along a line $\langle \mathbf{w}_0, \mathbf{w}_1 \rangle$

- ▶ The following algorithm should create the smallest set of waypoints in the joint space under a predefined deviation  $\epsilon > 0$ .
- ▶ Therefore the deviation between the trajectory  $\mathbf{q}(t)$  and the given line  $\langle \mathbf{w}_0, \mathbf{w}_1 \rangle$  must be smaller than  $\epsilon$ .

## Algorithm(Bounded\_Deviation)

1. Calculation of possible configurations  $\mathbf{q}_0, \mathbf{q}_1$  from  $\mathbf{w}_0, \mathbf{w}_1$  with the help of the inverse kinematics.
2. Calculation of the center in joint space:

$$\mathbf{q}_m = \frac{\mathbf{q}_0 + \mathbf{q}_1}{2}$$

# Motion along a line $\langle \mathbf{w}_0, \mathbf{w}_1 \rangle$ (cont.)

3. Calculation of the corresponding point of  $\mathbf{q}_m$  in the workspace with usage of direct kinematics:

$$\mathbf{w}_m = W(\mathbf{q}_m)$$

4. Calculation of the center in the workspace:

$$\mathbf{w}_M = \frac{\mathbf{w}_0 + \mathbf{w}_1}{2}$$

5. If the deviation  $\|\mathbf{w}_m - \mathbf{w}_M\| \geq \epsilon$ , then cancel; else add the  $\mathbf{w}_M$  as node point between  $\mathbf{w}_0$  and  $\mathbf{w}_1$ .
6. Recursive application of the algorithm for two new segments  $(\mathbf{w}_0, \mathbf{w}_M)$  und  $(\mathbf{w}_M, \mathbf{w}_1)$ .





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# Introduction to Robotics

## Lecture 7

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University of Hamburg  
Faculty of Mathematics, Informatics and Natural Sciences  
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- Recapitulation

- Approximation

- Interpolation methods

  - Bernstein-Polynomials

  - B-Splines



# Outline (cont.)

Trajectory generation

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Dynamics

Principles of Walking

Robot Control

Task-Level Programming and Trajectory Generation

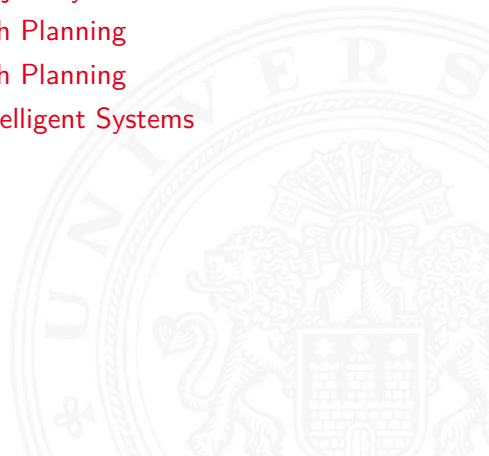
Task-level Programming and Path Planning

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## Trajectory generation

- ▶ Cartesian space
  - ▶ closer to the problem
  - ▶ better suited for collision avoidance
- ▶ Joint space
  - ▶ trajectories are immediately executable
  - ▶ limited to direct kinematics
  - ▶ allows accounting for joint angle limitations



# Trajectory generation – Recapitulation (cont.)

The trajectory of a robot with  $n$  degrees of freedom (DoF) is a vector of  $n$  parametric functions with a common parameter:

**Time**

$$q(t) = [q^1(t), q^2(t), \dots, q^n(t)]^T$$



# Trajectory generation – Recapitulation (cont.)

- ▶ Deriving a trajectory yields
  - ▶ velocity  $\dot{q}$
  - ▶ acceleration  $\ddot{q}$
  - ▶ jerk  $\dddot{q}$
- ▶ Jerk represents the change of acceleration over time, allowing for non-constant accelerations.
- ▶ A trajectory is  $C^k$ -continuous, if the first  $k$  derivatives of its path exist and are continuous.
- ▶ A trajectory is defined as *smooth* if it is at least  $C^2$ -continuous.









## Stone-Weierstrass theorem (1937)

### Theorem

- ▶ Every **non-periodic** continuous function **on a closed interval** can be approximated as closely as desired using **algebraic** polynomials.
- ▶ Every **periodic** continuous function can be approximated as closely as desired using **trigonometric** polynomials.



## Definition

Interpolation is the process of constructing new data points within the range of a discrete set of known data points.

- ▶ Interpolation is a kind of approximation.
- ▶ A function is designed to match the known data points exactly, while estimating the unknown data in between in an useful way.
- ▶ In robotics, interpolation is common for computing trajectories and motion/-controllers.

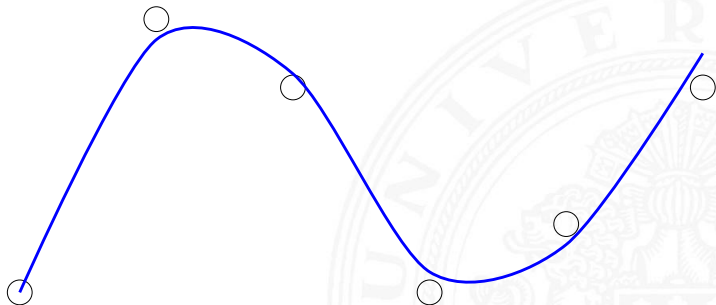


# Interpolation vs. Approximation

- ▶ Approximation: Fitting a curve to given data points.
  - ▶ Online tool: <https://mycurvefit.com/>
- ▶ Interpolation: Defining a curve exactly through all given data points
  - ▶ In the case of many, especially noisy, data points, approximation is often better suited than interpolation

# Interpolation vs. Approximation (cont.)

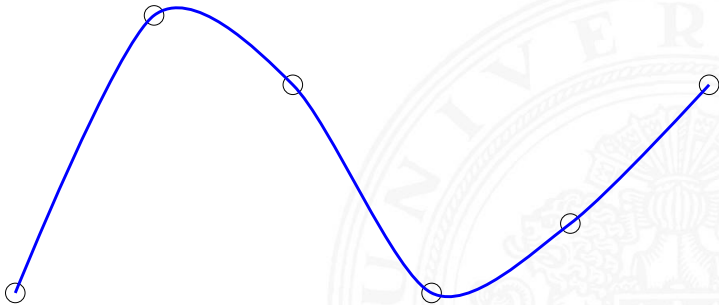
- ▶ Approximation of the relation between  $x$  and  $y$  (curve, plane, hyperplane) with a different function, given a limited number  $n$  of data points  $D = \{\mathbf{x}_i, y_i\}; i \in \{1 \dots n\}$ .



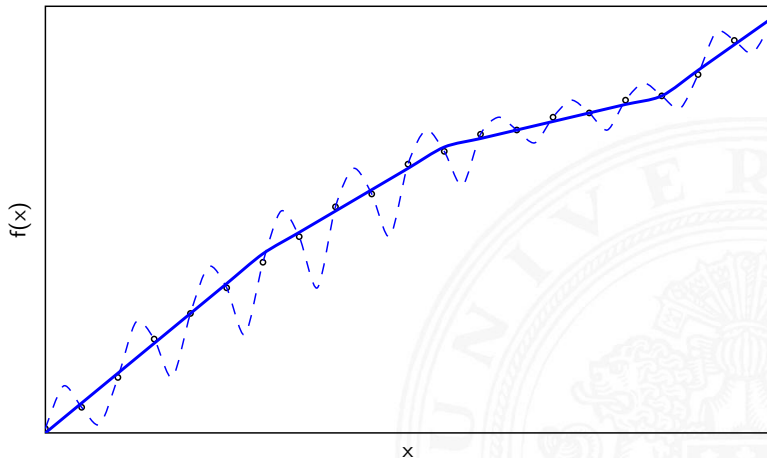


# Interpolation vs. Approximation (cont.)

- ▶ A special case of approximation is interpolation, where the model exactly matches all data points.  
If many data points are given or measurement data is affected by noise, approximation should preferably be used.



# Approximation without Overfitting





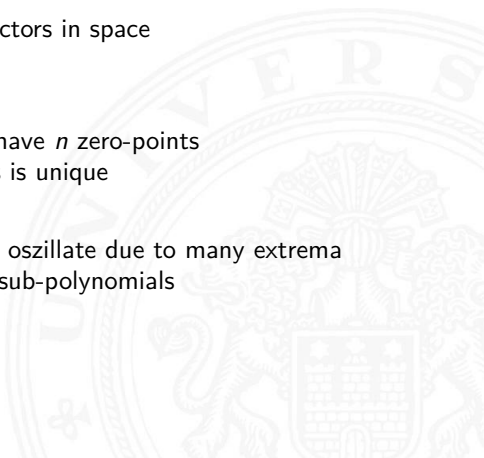
# Overfitting example

Complete the sequence: 1, 3, 5, 7, ?





- ▶ Base
  - ▶ subset of a vector space
  - ▶ able to represent arbitrary vectors in space
    - ▶ finite linear combination
- ▶ Uniqueness
  - ▶  $n^{\text{th}}$ -degree polynomials only have  $n$  zero-points
  - ▶ resulting system of equations is unique
- ▶ Oszillation
  - ▶ high-degree polynomials may oszillate due to many extrema
  - ▶ workaround: composition of sub-polynomials







Generation of robot-trajectories in joint-space over multiple stopovers requires appropriate interpolation methods.

Some interpolation methods using polynomials:

- ▶ Newton-polynomials
- ▶ Lagrange-polynomials
- ▶ Bernstein-polynomials
- ▶ Basis-Splines (B-Splines)

Examples of polynomials interpolation can be found at

- ▶ <http://polynomialregression.drque.net/online.php>
- ▶ <https://arachnoid.com/polysolve/>
- ▶ <http://www.hvks.com/Numerical/webinterpolation.html>

Bernstein-polynomials (named after Sergei Natanovich Bernstein) are real polynomials with integer coefficients.

## Definition

Bernstein-Polynomials of degree  $k$  are defined as:

$$B_{i,k}(t) = \binom{k}{i} (1-t)^{k-i} t^i, \quad i = 0, 1, \dots, k$$

Interpolation with  $B_{i,k}$ :

$$\mathbf{y} = \mathbf{b}_0 B_{0,k}(t) + \mathbf{b}_1 B_{1,k}(t) + \dots + \mathbf{b}_k B_{k,k}(t)$$

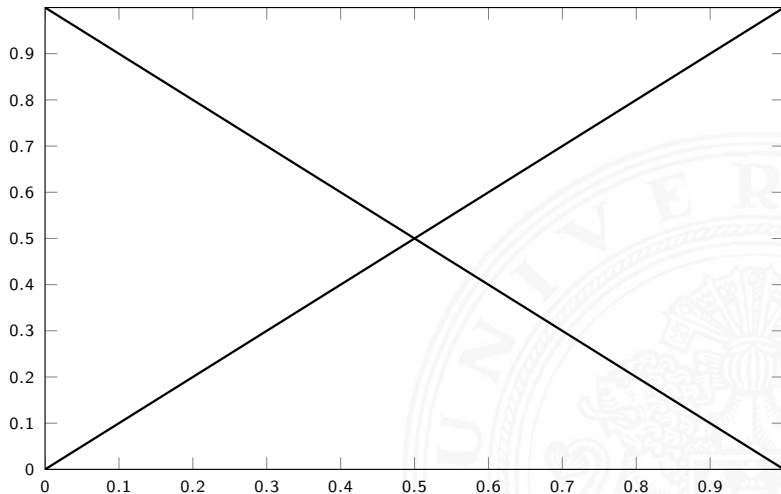


## Properties of Bernstein-polynomials:

- ▶ base property: the Bernstein polynomials  $[B_{i,n} : 0 \leq i \leq n]$  are linearly independent and form a base of the space of polynomials of degree  $\leq n$ ,
- ▶ decomposition of one:  $\sum_{i=0}^k B_{i,k}(t) \equiv \sum_{i=0}^k \binom{k}{i} t^i (1-t)^{k-i} \equiv 1$ ,
- ▶ positivity  $B_{i,k}(t) \geq 0$  for  $t \in [0, 1]$ ,
- ▶ recursivity:  $B_{i,k}(t) = (1-t)B_{i,k-1}(t) + t \cdot B_{i-1,k-1}(t)$
- ▶ ...

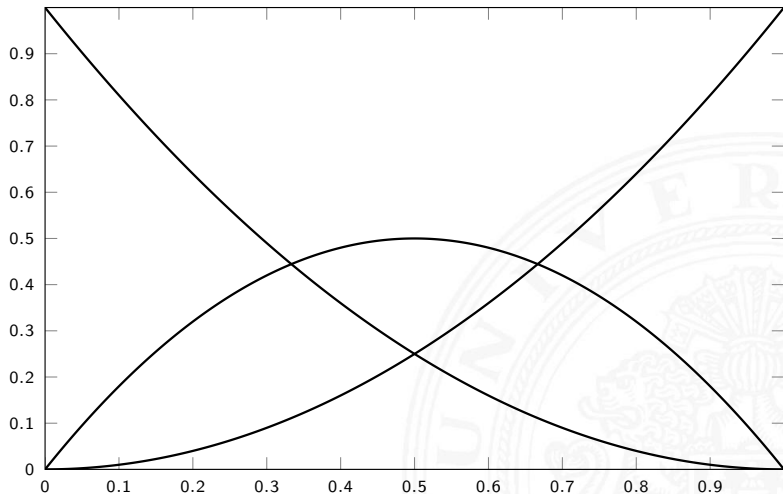


# Polynomial of degree 1



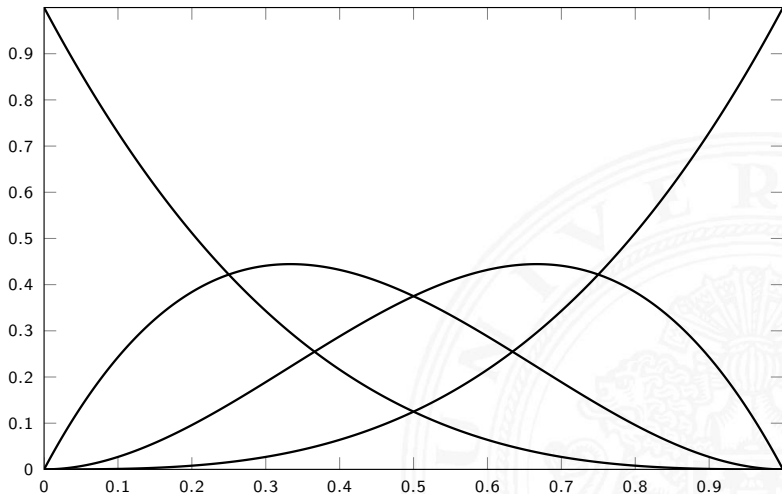


# Polynomial of degree 2



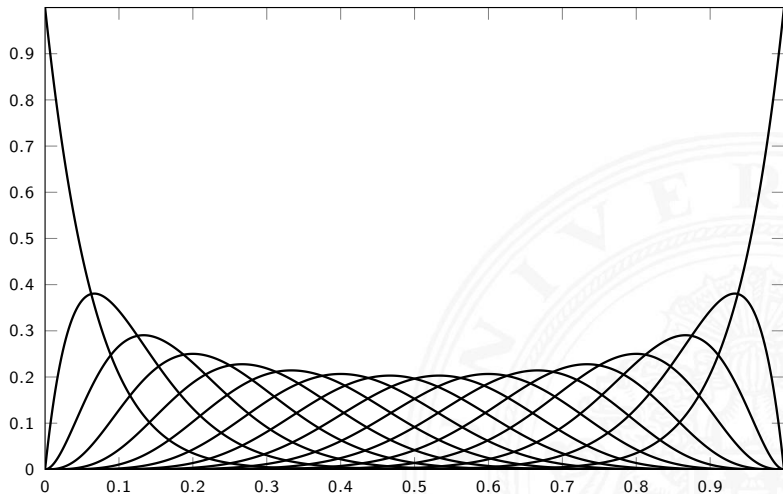


# Polynomial of degree 3





# Polynomial of degree 15





# Bernstein polynomials for trajectory generation

- ▶ Cubic polynomials ( $3^{\text{rd}}$ -degree) most used
- ▶ derivatives exist
  - ▶ velocity
  - ▶ acceleration
  - ▶ jerk
- ▶ provides smooth trajectory







- ▶ Splines are used as basis function (hence Basis-Spline)
- ▶ B-spline curve is a polynomial
- ▶ B-spline curve of order  $k$  is composed of B-Splines (piecewise)
- ▶ Generally,  $k - 2$  derivations are continuous at intersections
- ▶ B-splines are polynomials based on the following ordered parameters

$$\mathbf{t} = (t_0, t_1, t_2, \dots, t_m, t_{m+1}, \dots, t_{m+k}),$$

where

- ▶  $m$ : is given by the number of points to be interpolated
- ▶  $k$ : is the order of the b-spline curve

The following functions are known as normalized B-splines  $N_{i,k}$  of order  $k$ :

for  $k = 1$ , the degree is  $p = k - 1 = 0$ :

$$N_{i,1}(t) = \begin{cases} 1 & : \text{ for } t_i \leq t < t_{i+1} \\ 0 & : \text{ else} \end{cases}$$

as well as a recursive definition for  $k > 1$

$$N_{i,k}(t) = \frac{t - t_i}{t_{i+k-1} - t_i} N_{i,k-1}(t) + \frac{t_{i+k} - t}{t_{i+k} - t_{i+1}} N_{i+1,k-1}(t)$$

with  $i = 0, \dots, m$ .



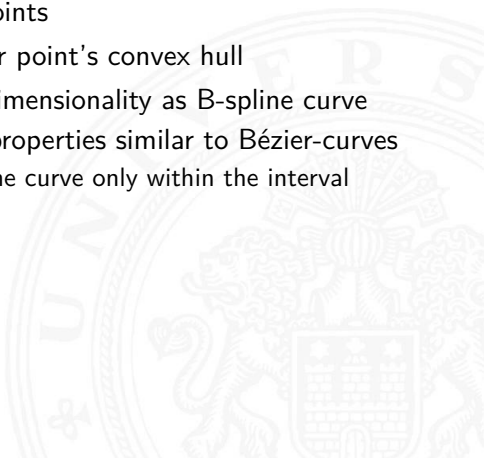
Linear splines correspond to piecewise linear functions

Advantages:

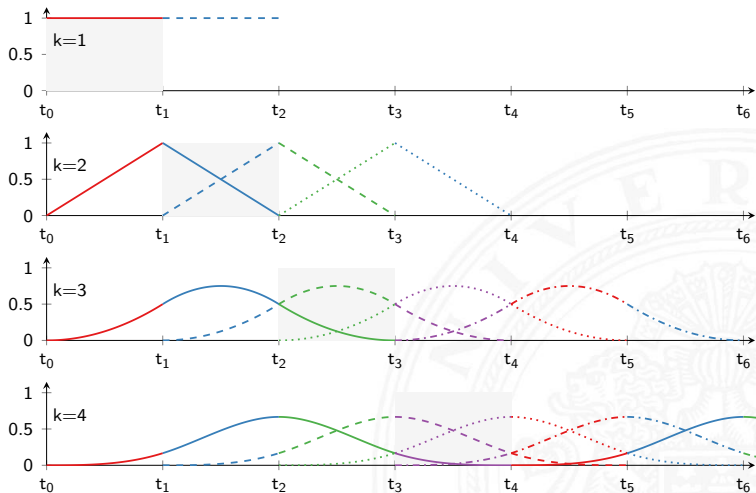
- ▶ splines are more flexible than polynomials due to their piecewise definition
- ▶ still, they are relatively simple and smooth
- ▶ prevent strong oscillation
- ▶ the values of the 1<sup>st</sup> and 2<sup>nd</sup> derivatives can be defined as constraints
- ▶ also applicable for representing surfaces (CAD modeling)



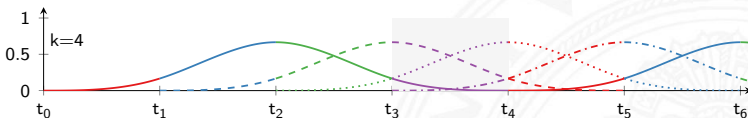
- ▶ Path controlled by de-Boor points
- ▶ Always constrained to de-Boor point's convex hull
- ▶ De-Boor points are of same dimensionality as B-spline curve
- ▶ B-spline curves have locality properties similar to Bézier-curves
  - ▶ control point  $P_i$  influences the curve only within the interval  $[\tau_i, \tau_{i+p}]$



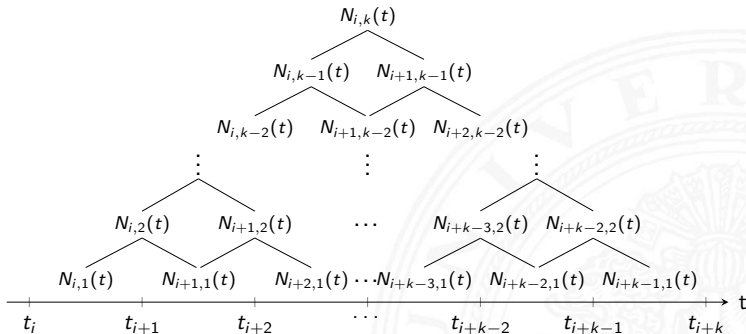
# Examples of B-splines



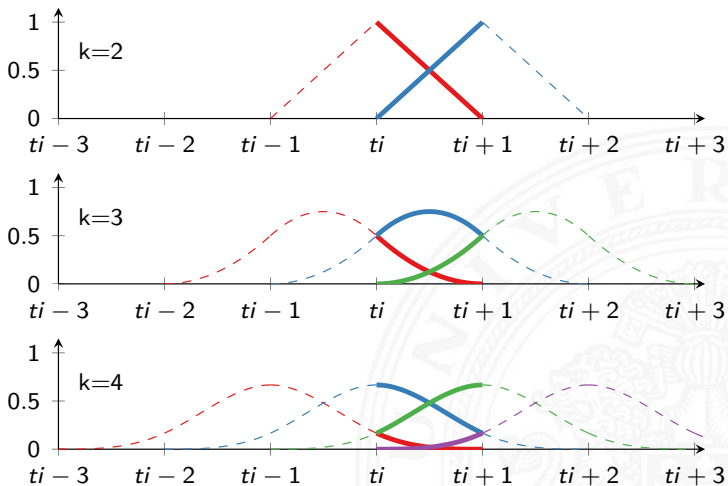
There are  $k = p + 1$  overlapping B-splines within an interval.  
An example of cubic ( $p = 3$ ) B-splines:



The recursive definition of a B-spline basis function  $N_{i,k}(t)$ :

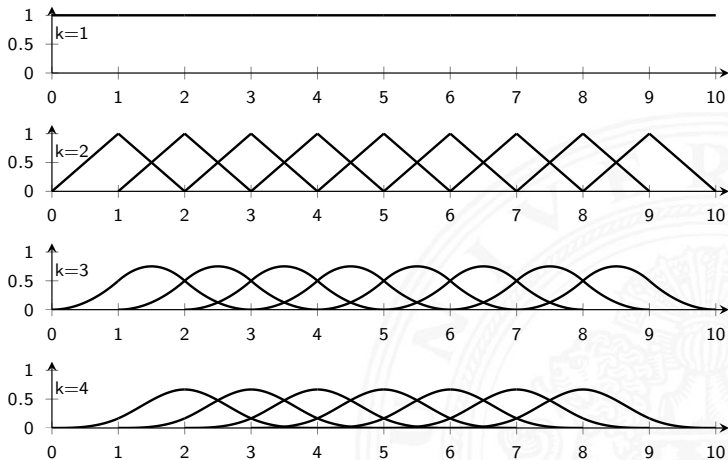


# B-Splines of degree $n$ in interval $[t_i, t_{i+1}]$





# Uniform B-splines of order 1 to 4

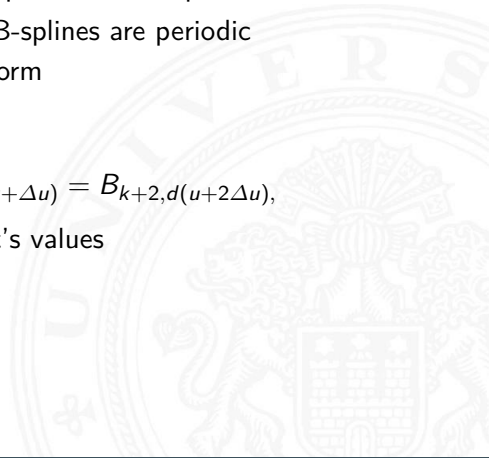




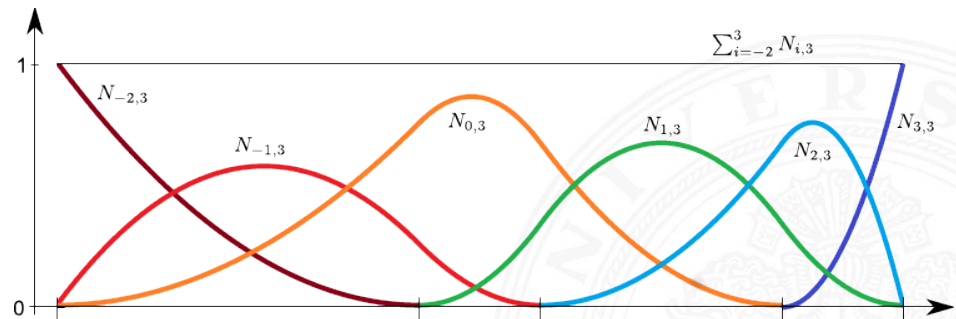
- ▶ Distance between uniform B-splines' control points is constant
- ▶ Weight-functions of uniform B-splines are periodic
- ▶ All functions have the same form
  - ▶ Easy to compute

$$B_{k,d}(u) = B_{k+1,d}(u+\Delta u) = B_{k+2,d}(u+2\Delta u),$$

$u$  represents the control-point's values



# Non-uniform B-spline of order 3



▶ Partition of unity:  $\sum_{i=0}^k N_{i,k}(t) = 1$ .

▶ Positivity:  $N_{i,k}(t) \geq 0$ .

▶ Local support:  $N_{i,k}(t) = 0$  for  $t \notin [t_i, t_{i+k}]$ .

▶  $C^{k-2}$  continuity:

If the knots  $\{t_i\}$  are pairwise different from each other, then

$$N_{i,k}(t) \in C^{k-2}$$

i.e.  $N_{i,k}(t)$  is  $(k - 2)$  times continuously differentiable.

# Construction of a B-spline curve

A B-spline curve can be composed by combining pre-defined control-points with B-spline basis functions:

$$\mathbf{r}(t) = \sum_{j=0}^m \mathbf{v}_j \cdot N_{j,k}(t)$$

where  $t$  is the position,  $\mathbf{r}(t)$  is a point on this B-spline curve and  $\mathbf{v}_j$  are called its control points (de-Boor points).

$\mathbf{r}(t)$  is a  $C^{k-2}$  continuous curve if the range of  $t$  is  $[t_{k-1}, t_{m+1}]$ .

# Generating control points from data points

The control points  $\mathbf{v}_j$  for interpolation are identical to the data points only if  $k = 2$ .

A series of control points forms a convex hull for the interpolating curve. Two methods for generation of control points from data points:

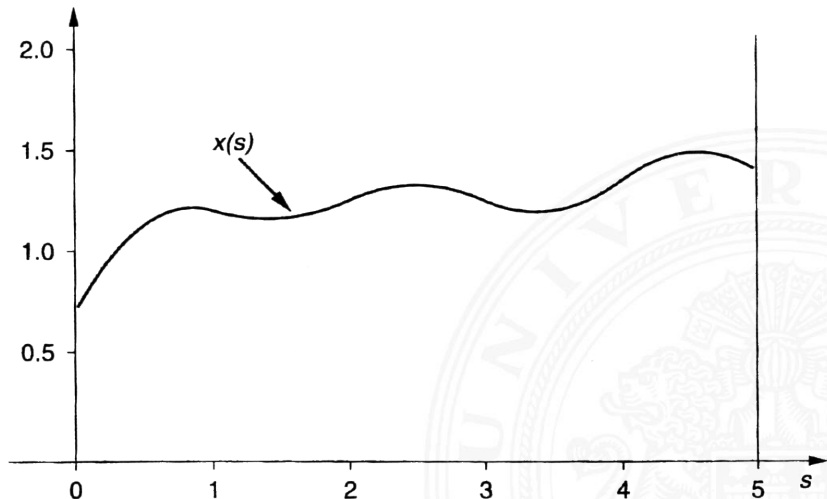
- ▶ by solving the following system of equations

$$\mathbf{q}_j(t) = \sum_{j=0}^m \mathbf{v}_j \cdot N_{j,k}(t)$$

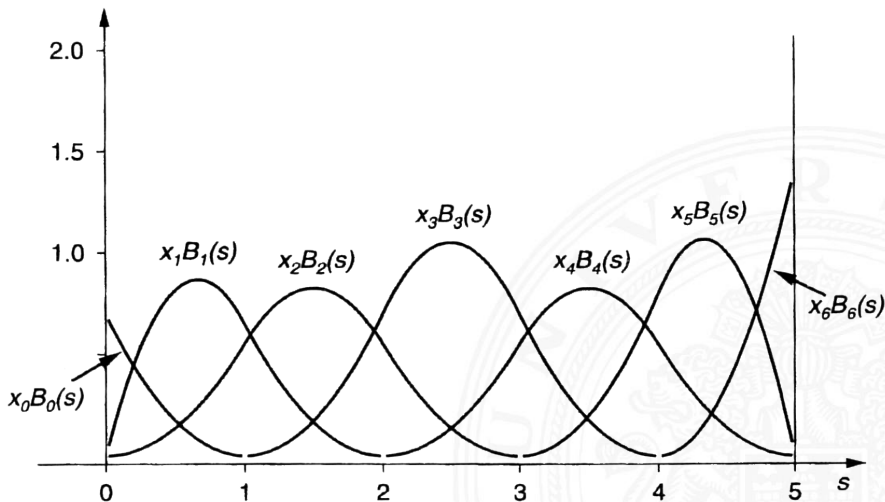
where  $\mathbf{q}_j$  are the data points to be interpolated,  $j = 0, \dots, m$ . [5]:

- ▶ by learning, based on gradient-descend. [6]

# Function approximation – 1D example



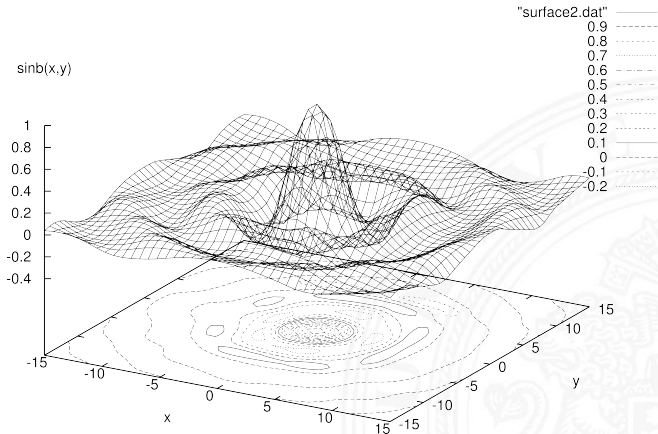
# Function approximation – 1D example (cont.)





# Function approximation – 2D example

Approximation of  $\text{sinb}(x,y) = \sin(\sqrt{x^2 + y^2})/\sqrt{x^2 + y^2}$

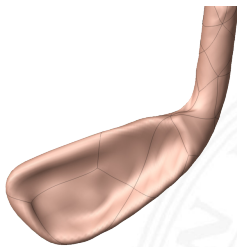


# Surface reconstruction with B-Splines

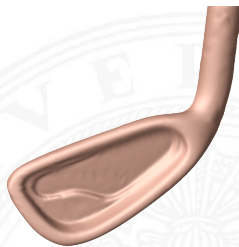
- ▶ Surface reconstruction from laser scan data using B-splines [7]



Pointcloud (16,585 points)



35 patches, 1.36% max. error



285 patches, 0.41% max. error

# Surface reconstruction with B-Splines (cont.)



Pointcloud (20,021 points)



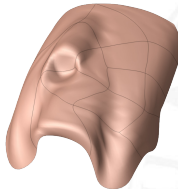
29 patches, 1.20% max. error



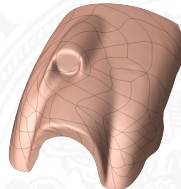
156 patches, 0.27% max. error



Pointcloud (37,974 points)



15 patches, 3.00% max. error



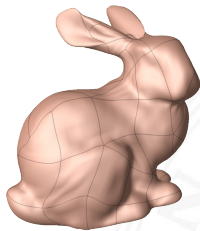
94 patches, 0.69% max. error

# Surface reconstruction with B-Splines (cont.)

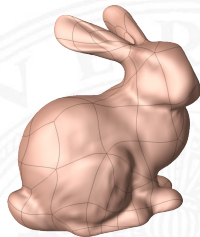
- ▶ Surface reconstruction from mesh data (reduced to 30,000 faces)



Mesh (69,473 faces)



72 patches, 4.64% max. error



153 patches, 1.44% max. error

To match  $l + 1$  data points  $(x_i, y_i)$  ( $i = 0, 1, \dots, l$ ) with a polynomial of degree  $l$ , the following approach of Lagrange can be used:

$$p_l(x) = \sum_{i=0}^l y_i L_i(x)$$

The interpolation polynomial in the Lagrange form is defined as follows:

$$L_i(x) = \frac{(x - x_0)(x - x_1) \cdots (x - x_{i-1})(x - x_{i+1}) \cdots (x - x_l)}{(x_i - x_0)(x_i - x_1) \cdots (x_i - x_{i-1})(x_i - x_{i+1}) \cdots (x_i - x_l)}$$

$$L_i(x_k) = \begin{cases} 1 & \text{if } i = k \\ 0 & \text{if } i \neq k \end{cases}$$



Universität Hamburg

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MIN Faculty  
Department of Informatics



# Introduction to Robotics

## Lecture 8

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University of Hamburg  
Faculty of Mathematics, Informatics and Natural Sciences  
Department of Informatics

**Technical Aspects of Multimodal Systems**

July 12, 2018



Introduction

Coordinate systems

Kinematic Equations

Robot Description

Inverse Kinematics for Manipulators

Differential motion with homogeneous transformations

Jacobian

Trajectory planning

Trajectory generation

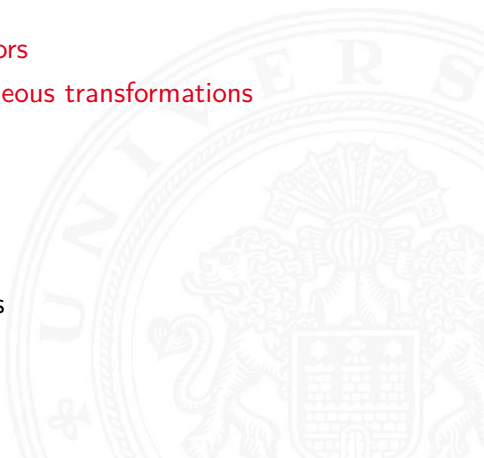
Dynamics

- Forward and inverse Dynamics

- Dynamics of Manipulators

- Newton-Euler-Equation

- Langrangian Equations





## General dynamic equations

Principles of Walking

Robot Control

Task-Level Programming and Trajectory Generation

Task-level Programming and Path Planning

Task-level Programming and Path Planning

Architectures of Sensor-based Intelligent Systems

Summary

Conclusion and Outlook







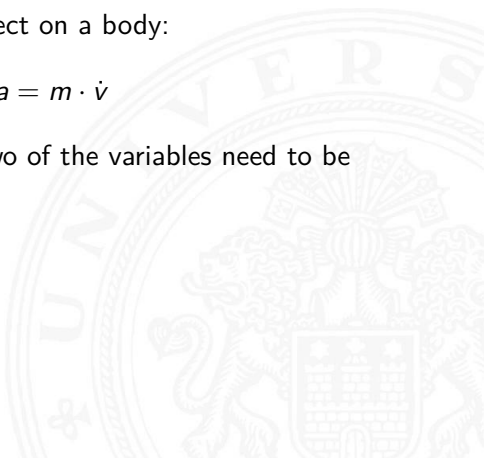
- ▶ A multibody system is a mechanical system of single bodies
  - ▶ connected by joints,
  - ▶ influenced by forces
- ▶ The term dynamics describes the behavior of bodies influenced by forces
  - ▶ Typical forces: weight, friction, centrifugal, magnetic, spring, ...
- ▶ kinematics just models the motion of bodies (without considering forces), therefore it can be seen as a subset of dynamics



We consider a force  $F$  and its effect on a body:

$$F = m \cdot a = m \cdot \dot{v}$$

In order to solve this equation, two of the variables need to be known.



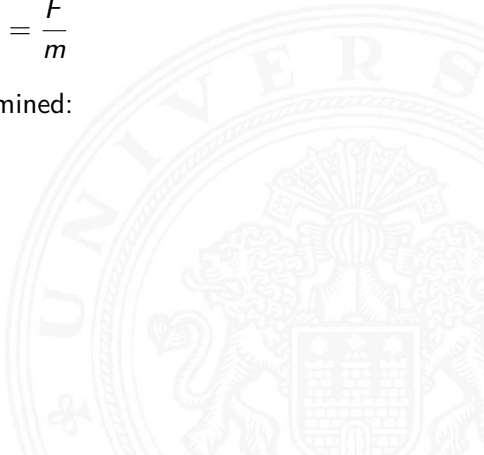


If the force  $F$  and the mass of the body  $m$  is known:

$$a = \dot{v} = \frac{F}{m}$$

Hence the following can be determined:

- ▶ velocity (by integration)
- ▶ coordinates of single bodies
- ▶ forward dynamics
- ▶ mechanical stress of bodies





## Input

$\tau_i$  = torque at joint  $i$  that effects a trajectory  $\Theta$ .  
 $i = 1, \dots, n$ , where  $n$  is the number of joints.

## Output

$\Theta_i$  = joint angle of  $i$   
 $\dot{\Theta}_i$  = angular velocity of joint  $i$   
 $\ddot{\Theta}_i$  = angular acceleration of joint  $i$



If the time curves of the joint angles are known, it can be differentiated twice.

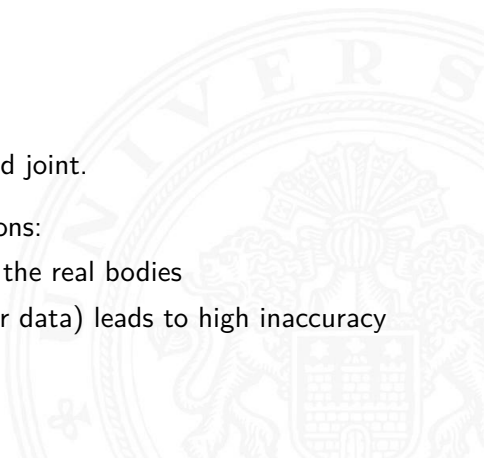
This way,

- ▶ internal forces
- ▶ and torques

can be obtained for each body and joint.

Problems of highly dynamic motions:

- ▶ models are not as complex as the real bodies
- ▶ differentiating twice (on sensor data) leads to high inaccuracy



# Inverse Dynamics (cont.)

## Input

$\Theta_i =$  joint angle  $i$

$\dot{\Theta}_i =$  angular velocity of joint  $i$

$\ddot{\Theta}_i =$  angular acceleration of joint  $i$

$i = 1, \dots, n$ , where  $n$  is the number of joints.

## Output

$\tau_i =$  required torque at joint  $i$  to produce trajectory  $\Theta$ .

## ▶ Forward dynamics:

- ▶ *Input*: joint forces / torques;
- ▶ *Output*: kinematics;
- ▶ *Application*: Simulation of a robot model.

## ▶ Inverse Dynamics:

- ▶ *Input*: desired trajectory of a manipulator;
- ▶ *Output*: required joint forces / torques;
- ▶ *Application*: model-based control of a robot.

$\tau(t) \rightarrow$  direct dynamics  $\rightarrow \mathbf{q}(t), (\dot{\mathbf{q}}(t), \ddot{\mathbf{q}}(t))$

$\mathbf{q}(t) \rightarrow$  inverse dynamics  $\rightarrow \tau(t)$

Unlike kinematics, the inverse dynamics is easier to solve than forward dynamics

Two methods for calculation:

- ▶ Analytical methods
  - ▶ based on Lagrangian equations
- ▶ Synthetic methods:
  - ▶ based on the Newton-Euler equations

## Computation time

Complexity of solving the Lagrange-Euler-model is  $O(n^4)$  where  $n$  is the number of joints.

$n = 6$ : 66,271 multiplications and 51,548 additions.

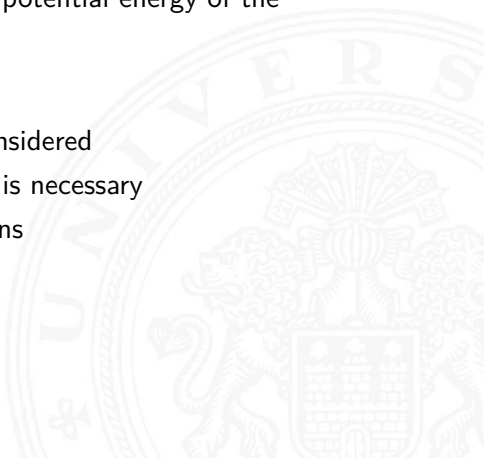




The description of manipulator dynamics is directly based on the relations between the kinetic and potential energy of the manipulator joints.

Here:

- ▶ constraining forces are not considered
- ▶ deep knowledge of mechanics is necessary
- ▶ high effort of defining equations
- ▶ can be solved by software

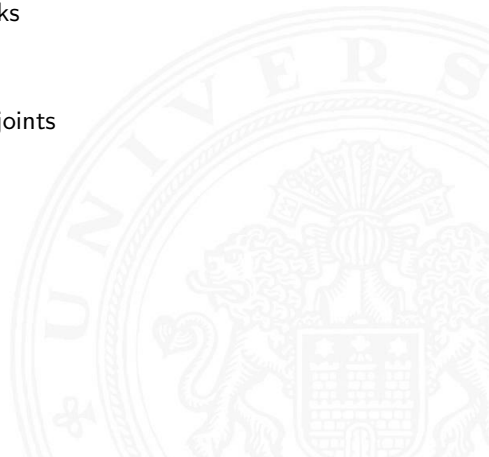




- ▶ Determine the kinematics from the fixed base to the TCP (relative kinematics)
- ▶ The resulting acceleration leads to forces towards rigid bodies
- ▶ The combination of constraining forces, payload forces, weight forces and working forces can be defined for every rigid body. All torques and momentums need to be in balance
- ▶ Solving this formula leads to the joint forces
- ▶ Especially suitable for serial kinematics of manipulator



- ▶ Functional affordance
  - ▶ trajectory and velocity of links
  - ▶ load on a link
- ▶ Control quantity
  - ▶ velocity and acceleration of joints
  - ▶ forces and torques
- ▶ Robot-specific elements
  - ▶ geometry
  - ▶ mass distribution





# Aim of determining robot dynamics

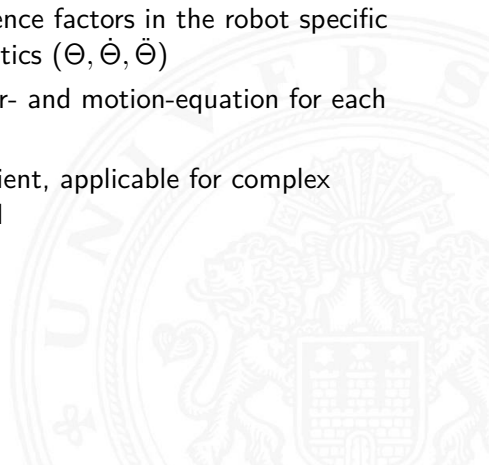
- ▶ Determining joint forces and torques for one point of a trajectory ( $\Theta, \dot{\Theta}, \ddot{\Theta}$ )
- ▶ Determining the motion of a link or the complete manipulator for given joint-forces and -torques ( $\tau$ )

To achieve this the mathematical model is applied.



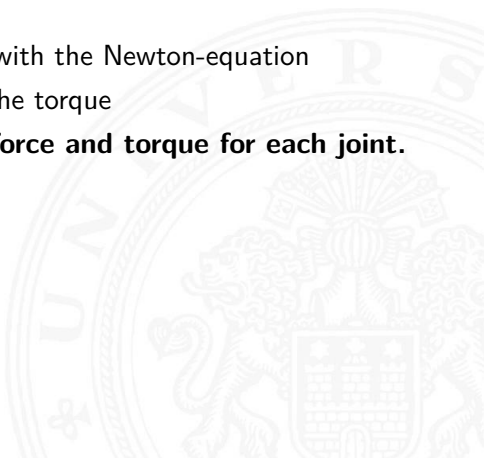
# Formulation of robot dynamics

- ▶ Combining the different influence factors in the robot specific motion equation from kinematics ( $\Theta, \dot{\Theta}, \ddot{\Theta}$ )
- ▶ Practically the Newton-, Euler- and motion-equation for each joint are combined
- ▶ Advantages: numerically efficient, applicable for complex geometry, can be modularized



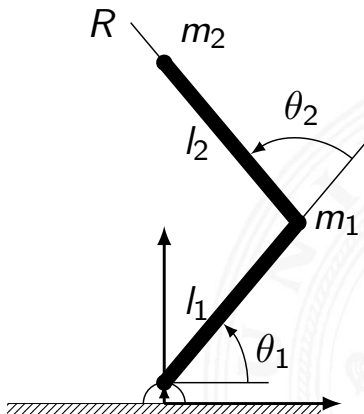


- ▶ We can determine the forces with the Newton-equation
- ▶ The Euler-equation provides the torque
- ▶ **The combination provides force and torque for each joint.**



# Example: A 2 DOF manipulator

Dynamics of a multibody system, example: a two joint manipulator.



# Newton-Euler-Equations for 2 DOF manipulator

Using Newton's second law, the forces at the center of mass at link 1 and 2 are:

$$\mathbf{F}_1 = m_1 \ddot{\mathbf{r}}_1$$

$$\mathbf{F}_2 = m_2 \ddot{\mathbf{r}}_2$$

where

$$\mathbf{r}_1 = \frac{1}{2} l_1 (\cos \theta_1 \vec{i} + \sin \theta_1 \vec{j})$$

$$\mathbf{r}_2 = 2\mathbf{r}_1 + \frac{1}{2} l_2 [\cos(\theta_1 + \theta_2) \vec{i} + \sin(\theta_1 + \theta_2) \vec{j}]$$





Euler equations:

$$\tau_1 = \mathbf{I}_1 \dot{\omega}_1 + \omega_1 \times \mathbf{I}_1 \omega_1$$

$$\tau_2 = \mathbf{I}_2 \dot{\omega}_2 + \omega_2 \times \mathbf{I}_2 \omega_2$$

where

$$\mathbf{I}_1 = \frac{m_1 l_1^2}{12} + \frac{m_1 R^2}{4}$$

$$\mathbf{I}_2 = \frac{m_2 l_2^2}{12} + \frac{m_2 R^2}{4}$$

The angular velocities and angular accelerations are:

$$\omega_1 = \dot{\theta}_1$$

$$\omega_2 = \dot{\theta}_1 + \dot{\theta}_2$$

$$\dot{\omega}_1 = \ddot{\theta}_1$$

$$\dot{\omega}_2 = \ddot{\theta}_1 + \ddot{\theta}_2$$

As  $\omega_i \times \mathbf{I}_i \omega_i = 0$ , the torques at the center of mass of links 1 and 2 are:

$$\tau_1 = \mathbf{I}_1 \ddot{\theta}_1$$

$$\tau_2 = \mathbf{I}_2 (\ddot{\theta}_1 + \ddot{\theta}_2)$$

$\mathbf{F}_1, \mathbf{F}_2, \tau_1, \tau_2$  are used for force and torque balance and are solved for joint 1 and 2.

The Lagrangian function  $L$  is defined as the difference between kinetic energy  $K$  and potential energy  $P$  of the system.

$$L = K - P$$

## Theorem

The motion equations of a mechanical system with coordinates  $\mathbf{q} \in \Theta^n$  and the Lagrangian function  $L$  is defined by:

$$\frac{d}{dt} \frac{\partial L}{\partial \dot{q}_i} - \frac{\partial L}{\partial q_i} = F_i, \quad i = 1, \dots, n$$

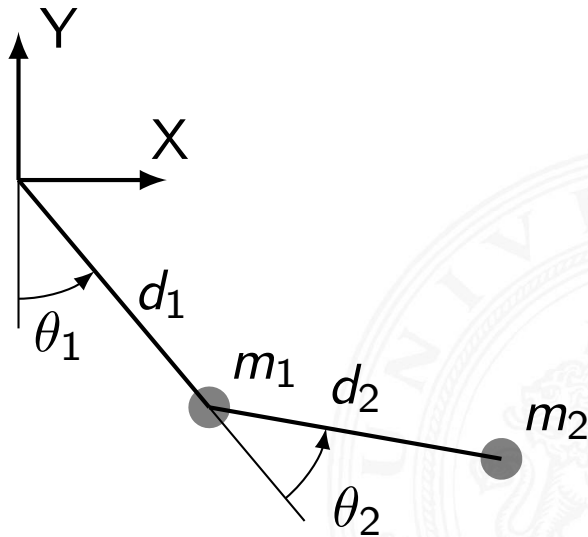
where

$q_i$ : the coordinates, where the kinetic and potential energy is defined;

$\dot{q}_i$ : the velocity;

$F_i$ : the force or torque, depending on the type of joint (rotational or linear)

# Example: A two joint manipulator



# Langragian Method for two joint manipulator

The kinetic energy of mass  $m_1$  is:

$$K_1 = \frac{1}{2} m_1 d_1^2 \dot{\theta}_1^2$$

The potential energy is:

$$P_1 = -m_1 g d_1 \cos(\theta_1)$$

The cartesian positions are:

$$\begin{aligned}x_2 &= d_1 \sin(\theta_1) + d_2 \sin(\theta_1 + \theta_2) \\y_2 &= -d_1 \cos(\theta_1) - d_2 \cos(\theta_1 + \theta_2)\end{aligned}$$



The cartesian components of velocity are:

$$\dot{x}_2 = d_1 \cos(\theta_1) \dot{\theta}_1 + d_2 \cos(\theta_1 + \theta_2) (\dot{\theta}_1 + \dot{\theta}_2)$$

$$\dot{y}_2 = d_1 \sin(\theta_1) \dot{\theta}_1 + d_2 \sin(\theta_1 + \theta_2) (\dot{\theta}_1 + \dot{\theta}_2)$$

The square of velocity is:

$$v_2^2 = \dot{x}_2^2 + \dot{y}_2^2$$

The kinetic energy of link 2 is:

$$K_2 = \frac{1}{2} m_2 v_2^2$$

The potential energy of link 2 is:

$$P_2 = -m_2 g d_1 \cos(\theta_1) - m_2 g d_2 \cos(\theta_1 + \theta_2)$$

# Langragian Method for two joint manipulator (cont.)

The Lagrangian function is:

$$L = (K_1 + K_2) - (P_1 + P_2)$$

The force/torque to joint 1 and 2 are:

$$\tau_1 = \frac{d}{dt} \frac{\partial L}{\partial \dot{\theta}_1} - \frac{\partial L}{\partial \theta_1}$$

$$\tau_2 = \frac{d}{dt} \frac{\partial L}{\partial \dot{\theta}_2} - \frac{\partial L}{\partial \theta_2}$$

# Langragian Method for two joint manipulator (cont.)

$\tau_1$  and  $\tau_2$  are expressed as follows:

$$\begin{aligned}\tau_1 = & D_{11}\ddot{\theta}_1 + D_{12}\ddot{\theta}_2 + D_{111}\dot{\theta}_1^2 + D_{122}\dot{\theta}_2^2 \\ & + D_{112}\dot{\theta}_1\dot{\theta}_2 + D_{121}\dot{\theta}_2\dot{\theta}_1 + D_1\end{aligned}$$

$$\begin{aligned}\tau_2 = & D_{21}\ddot{\theta}_1 + D_{22}\ddot{\theta}_2 + D_{211}\dot{\theta}_1^2 + D_{222}\dot{\theta}_2^2 \\ & + D_{212}\dot{\theta}_1\dot{\theta}_2 + D_{221}\dot{\theta}_2\dot{\theta}_1 + D_2\end{aligned}$$

where

$D_{ij}$ : the inertia to joint  $i$ ;

$D_{ij}$ : the coupling of inertia between joint  $i$  and  $j$ ;

$D_{ijj}$ : the coefficients of the centripetal force to joint  $i$  because of the velocity of joint  $j$ ;

$D_{iik}(D_{iki})$ : the coefficients of the Coriolis force to joint  $i$  effected by the velocities of joint  $i$  and  $k$ ;

$D_i$ : the gravity of joint  $i$ .



# General dynamic equations of a manipulator

$$\tau = M(\Theta)\ddot{\Theta} + V(\Theta, \dot{\Theta}) + G(\Theta)$$

$M(\Theta)$ : the position dependent  $n \times n$ -mass matrix of a manipulator  
For the example given above:

$$M(\Theta) = \begin{bmatrix} D_{11} & D_{12} \\ D_{21} & D_{22} \end{bmatrix}$$

$V(\Theta, \dot{\Theta})$ : an  $n \times 1$ -vector of centripetal and coriolis coefficients  
For the example given above:

$$V(\Theta, \dot{\Theta}) = \begin{bmatrix} D_{111}\dot{\theta}_1^2 + D_{122}\dot{\theta}_2^2 + D_{112}\dot{\theta}_1\dot{\theta}_2 + D_{121}\dot{\theta}_2\dot{\theta}_1 \\ D_{211}\dot{\theta}_1^2 + D_{222}\dot{\theta}_2^2 + D_{212}\dot{\theta}_1\dot{\theta}_2 + D_{221}\dot{\theta}_2\dot{\theta}_1 \end{bmatrix}$$

# General dynamic equations of a manipulator (cont.)

- ▶ a term such as  $D_{111}\dot{\theta}_1^2$  is caused by coriolis force;
- ▶ a term such as  $D_{112}\dot{\theta}_1\dot{\theta}_2$  is caused by coriolis force and depends on the (math.) product of the two velocities.
- ▶  $G(\Theta)$ : a term of velocity, depends on  $\Theta$ .
  - ▶ for the example given above

$$G(\Theta) = \begin{bmatrix} D_1 \\ D_2 \end{bmatrix}$$



Introduction

Coordinate systems

Kinematic Equations

Robot Description

Inverse Kinematics for Manipulators

Differential motion with homogeneous transformations

Jacobian

Trajectory planning

Trajectory generation

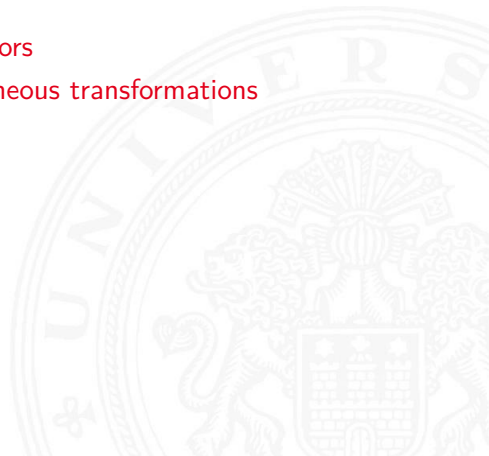
Dynamics

Principles of Walking

- Introduction

- ZMP

- Inverted Pendulum





# Outline (cont.)

Principles of Walking

Introduction to Robotics

Stabilizing  
Full Body Motion

Robot Control

Task-Level Programming and Trajectory Generation

Task-level Programming and Path Planning

Task-level Programming and Path Planning

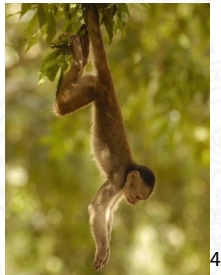
Architectures of Sensor-based Intelligent Systems

Summary

Conclusion and Outlook



- ▶ Enabling locomotion in difficult terrain
- ▶ Legs can be used for other things
- ▶ Necessary to integrate robots in a human environment



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<sup>3</sup>[http://1.bp.blogspot.com/-MhFvPPR5V4/UmifTu4r\\_OI/AAAAAAAAAFtI/FvJqeWu9Ahc/s1600/13-pictures-of-crazy-goats-on-cliff-transparent.png](http://1.bp.blogspot.com/-MhFvPPR5V4/UmifTu4r_OI/AAAAAAAAAFtI/FvJqeWu9Ahc/s1600/13-pictures-of-crazy-goats-on-cliff-transparent.png)

<sup>4</sup><https://www.allposters.com>

- ▶ Stability
- ▶ Energy consumption
- ▶ Hardware costs
- ▶ Complex control



<sup>5</sup><https://www.wikihow.com/Recognize-the-Signs-of-Intoxication>

- ▶ Static - Dynamic
- ▶ Passiv - Active
- ▶ 2,4,6,8,... legged
- ▶ Open loop - closed loop
- ▶ This lecture: active bipedal walking, no running



6



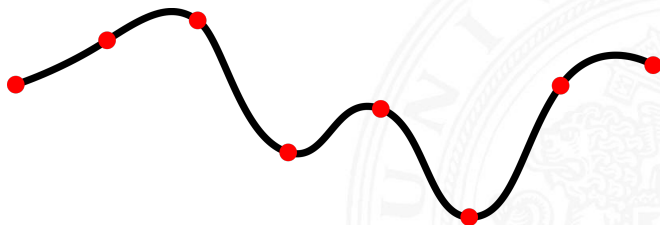
7

<sup>6</sup> <https://3c1703fe8d.site.internapcdn.net/newman/gfx/news/hires/2017/1-sixleggedrob-transparent.png>

<sup>7</sup> <https://asl.ethz.ch/research/legged-robots.html>

# Types of Implementing Walking

- ▶ Control Theory
- ▶ Neural Networks
- ▶ Central Pattern Generators
- ▶ Evolutional Computing
- ▶ Expert Solution



<sup>8</sup><https://de.wikipedia.org/wiki/Spline-Interpolation>



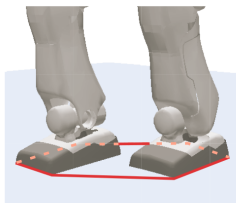


# Important Words

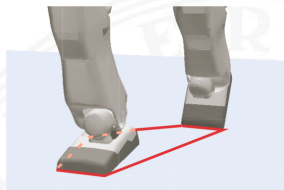
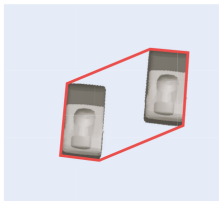
- ▶ Support leg/foot
- ▶ Flying leg/foot
- ▶ Torso / trunk
- ▶ Step / double step
- ▶ Sagittal / lateral



- Convex hull of all ground contact points



(a) Full contact of both feet

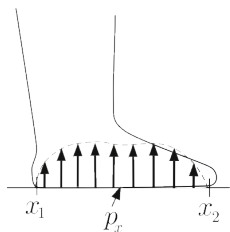


(b) Partial contact

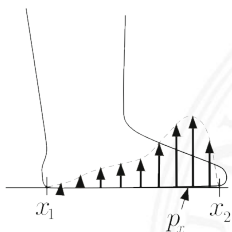
9

# Center of Pressure (CoP)

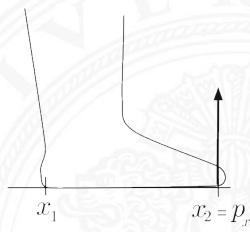
- ▶ Center of ground reaction forces
- ▶ Those can also be horizontal
- ▶ Moment becomes zero
- ▶ Equals the zero moment point (ZMP)



(a) Almost flat



(b) Biased distribution

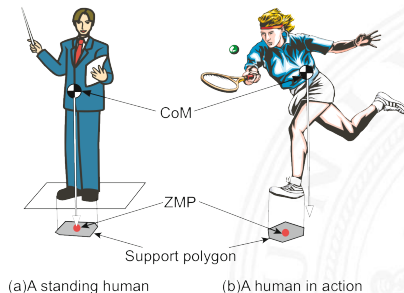


(c) Concentrate at tiptoe 10

<sup>10</sup> Introduction to Humanoid Robotics, Shuji Kajita, 2015

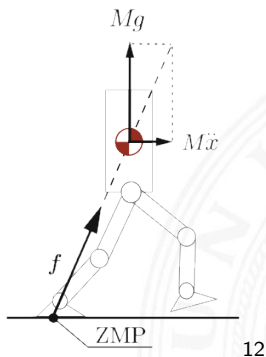
# Zero Moment Point (ZMP)

- ▶ When standing, projection of CoM coincides with ZMP
- ▶ When dynamic, CoM outside of support polygon
- ▶ ZMP is always inside support polygon



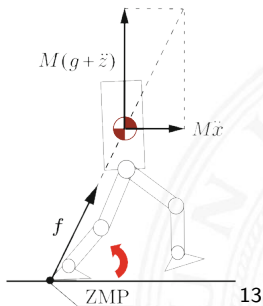
11

- ▶ Forces of the robot define position of ZMP
- ▶ Can it get outside of the support polygon?



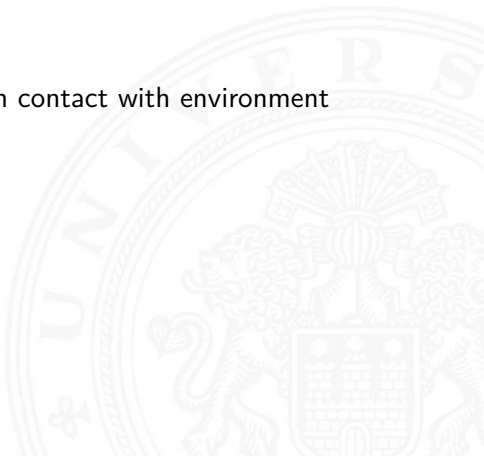
12

- ▶ No! The ZMP is always in the support polygon
- ▶ If it is on an edge, the robot rotates





- ▶ Sole slips on ground
- ▶ Other parts of the robot are in contact with environment
- ▶ Ground is not perfectly level





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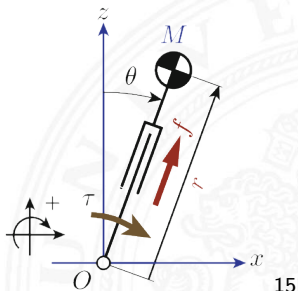
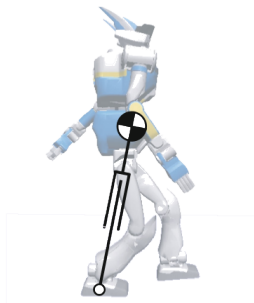
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<sup>14</sup> [https://www.reddit.com/r/rickandmorty/comments/70t45i/anyone\\_else\\_wish\\_heshe\\_could\\_experience\\_true\\_level/](https://www.reddit.com/r/rickandmorty/comments/70t45i/anyone_else_wish_heshe_could_experience_true_level/)

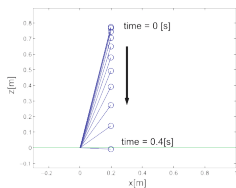


# Inverted Pendulum

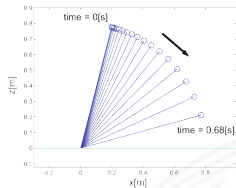
- ▶ Simplest model for walking robot or human
- ▶ Point mass at end of massless telescopic leg
- ▶  $f$ : kick force,  $\tau$ : torque



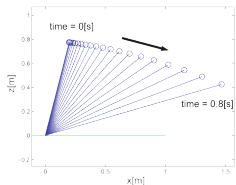
# Inverted Pendulum



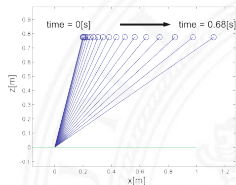
(a)  $f = 0$  : Free fall of CoM



(b)  $f = Mg \cos \theta - Mr \dot{\theta}^2$  : Fall down with constant leg length



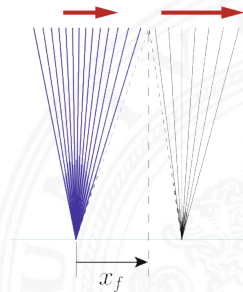
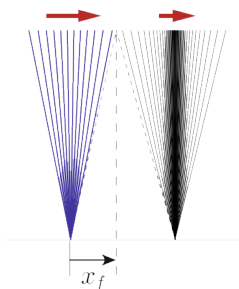
(c)  $f = Mg$  : Fall down and acceleration



(d)  $f = Mg / \cos \theta$  : CoM accelerates while keeping the initial height

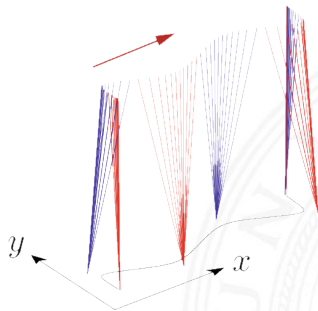
16

- ▶ Considering fixed step length
- ▶ Earlier touchdown of the next step results slow down
- ▶ Later touchdown of the next step results speed ups



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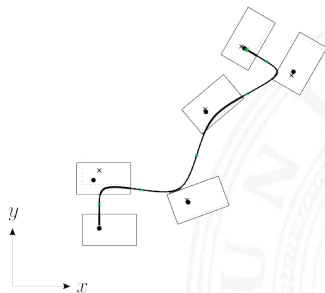
- ▶ Transfer to 3D
- ▶ Introduction of lateral movement



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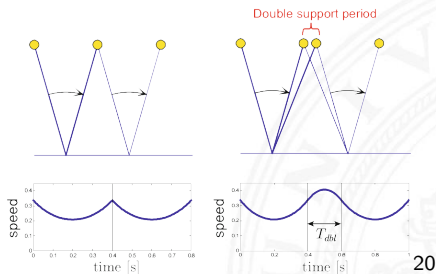
# Omni-directional Walking

- ▶ Forward ( $x$ )
- ▶ Sideward ( $y$ )
- ▶ Turn (yaw)



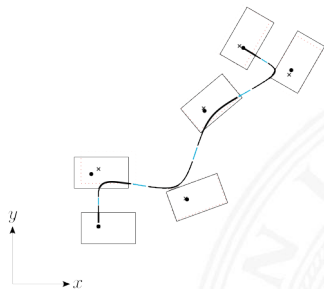
19

- ▶ Accelerations are extreme on support change
- ▶ Not feasible in reality
- ▶ Introduction of a double support phase



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# Double Support



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# Zero Support



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<sup>22</sup><https://thumbs.dreamstime.com/z/running-robot-27653003-transparent.png>





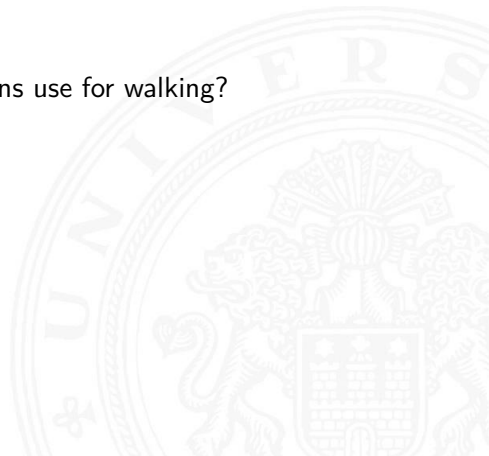
- ▶ Why are we not finished yet?





# Detecting Instability

Which senses do you think humans use for walking?





- ▶ Sensors
  - ▶ IMU(s)
  - ▶ Force sensors on foot sole
  - ▶ 6 axis force/torque sensor in ankle
  - ▶ Joint Torques
  - ▶ Camera
- ▶ Model
  - ▶ Joint positions
  - ▶ Link masses and inertia
  - ▶ Rigidity of links (especially foot soles)



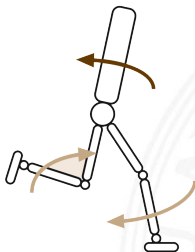


- ▶ Simple stopping
- ▶ Counter movements with the arms/torso
- ▶ Change of step position (capture steps)



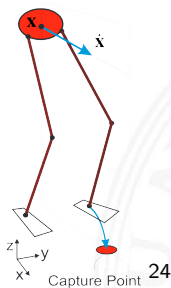
# Counter Movements with Upper Body

- ▶ Rotation around edge of support polygon
- ▶ Introduce counter force with arms/torso or flying leg
- ▶ Flying leg is mostly not usable



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- ▶ Capture point is where the robot comes to a complete stop
- ▶ Multiple capture steps may be necessary
- ▶ You can completely base your walking on this



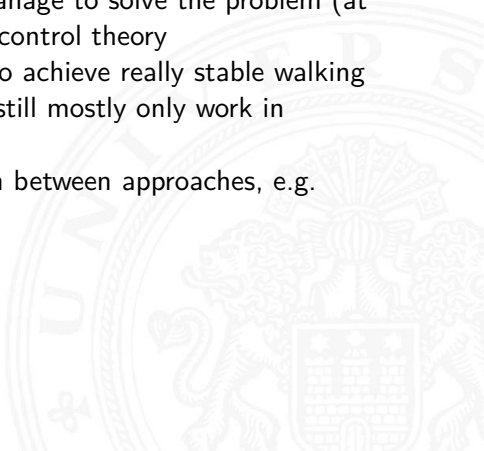
<sup>24</sup> <https://ieeexplore.ieee.org/stamp/stamp.jsp?tp=&arnumber=6094435>



- ▶ We will not cover machine learning
- ▶ If you are interested join my lecture in "Intelligent Robotics" in the winter term
- ▶ General approaches are:
  - ▶ Learning parameter of a walking pattern generator (e.g. double support length)
  - ▶ Learning neural networks from scratch
  - ▶ Learning from demonstration
  - ▶ Artificial central pattern generators



- ▶ Some very expensive robot manage to solve the problem (at least most of the time) using control theory
- ▶ Cheaper robots still struggle to achieve really stable walking
- ▶ Machine learning approaches still mostly only work in simulation (reality gap)
- ▶ Working on better comparison between approaches, e.g. EuroBench







BALANCE



## System Abilities\*

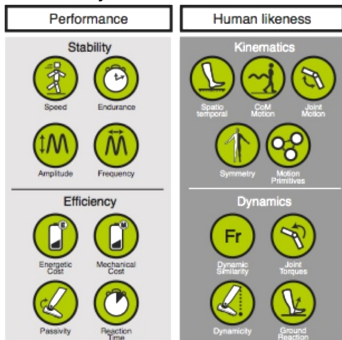
HUMANOIDS



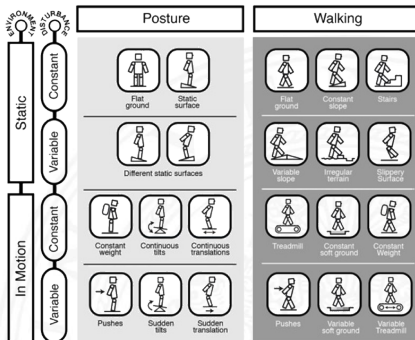
WEARABLE ROBOTS



CLINICAL ASSESSMENT



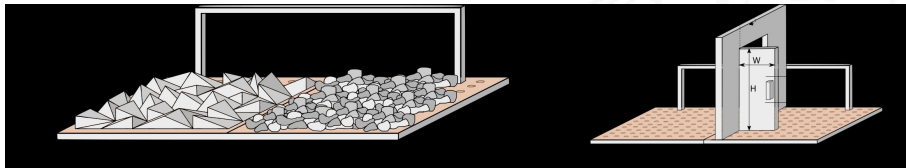
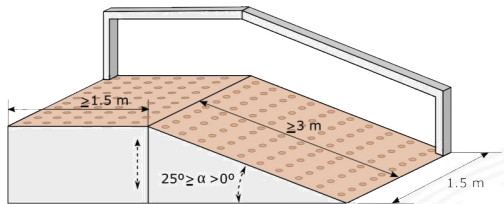
## Motor skills\*



[www.benchmarkinglocomotion.org](http://www.benchmarkinglocomotion.org)

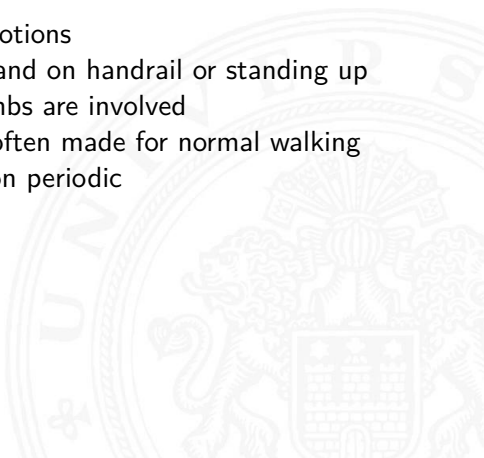
\* Torricelli et al. 2015, Benchmarking Bipedal Locomotion: A Unified Scheme for Humanoids, Wearable Robots, and Humans

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- ▶ Small overview of full body motions
- ▶ Examples are: walking with hand on handrail or standing up
- ▶ Higher complexity since all limbs are involved
- ▶ Breaks assumptions that are often made for normal walking
- ▶ Motions can be periodic or non periodic



- ▶ Using handrail, pushing cart, opening door, holding hands, using walking stick, collaborative carrying
- ▶ Introduces additional forces on the robot
- ▶ Support polygon maybe totally different
- ▶ More complex models have to be used
- ▶ Currently mostly used approach: quadratic programming
  - ▶ Solve problem of optimizing a quadratic function with multiple linear constrains
  - ▶ Use rigid body dynamics together with a model
  - ▶ Problems
    - ▶ Model is not perfect
    - ▶ If caring an object, you need a model of it
    - ▶ Robot is maybe not perfectly rigid



# Non Periodic Motions

- ▶ Simpler due to known start and end
- ▶ Examples
  - ▶ Standing up
  - ▶ Kicking
  - ▶ Grasping
  - ▶ Waving





- ▶ Keypoint teach in
  - ▶ Put robot into key positions manually
  - ▶ Save joint positions at these points
  - ▶ Interpolate
  - ▶ Useful for simple motions (e.g. waving) or static robots
- ▶ Learning from demonstration
  - ▶ Either demonstrate on the robot itself or by using motion capture
  - ▶ Normally more than one demonstration
  - ▶ Not just simply replaying
- ▶ Cartesian splines
  - ▶ Define trajectories of the limbs with Cartesian splines manually
  - ▶ Comparably easy to do for humans (much better than joint space)
  - ▶ Splines configurable with few parameters
  - ▶ Use inverse kinematics to compute joint goals
  - ▶ Optionally use additional goals in the IK solver to keep balance



- ▶ DeepLearning
  - ▶ Just let it learn in simulation till it works
  - ▶ Put it on the robot and hope for the best
  - ▶ Reality gap
- ▶ Control Theory
  - ▶ Have an open loop trajectory, e.g. from teach in
  - ▶ Use a stability criterion, e.g. ZMP
  - ▶ Adjust joint goals with controller, e.g. PID
- ▶ More on the learning aspect in the intelligent robotics lecture



Questions?







Universität Hamburg

DER FORSCHUNG | DER LEHRE | DER BILDUNG

MIN Faculty  
Department of Informatics



# Introduction to Robotics

## Lecture 9

**Lasse Einig, Jianwei Zhang**

[einig, zhang]@informatik.uni-hamburg.de



University of Hamburg  
Faculty of Mathematics, Informatics and Natural Sciences  
Department of Informatics

Technical Aspects of Multimodal Systems

July 12, 2018

Introduction

Coordinate systems

Kinematic Equations

Robot Description

Inverse Kinematics for Manipulators

Differential motion with homogeneous transformations

Jacobian

Trajectory planning

Trajectory generation

Dynamics

Principles of Walking

Robot Control

Introduction



# Outline (cont.)

Robot Control

Introduction to Robotics

Classification of Robot Arm Controllers

Internal Sensors of Robots

Control System of a Robot

Task-Level Programming and Trajectory Generation

Task-level Programming and Path Planning

Task-level Programming and Path Planning

Architectures of Sensor-based Intelligent Systems

Summary

Conclusion and Outlook



## Controller

- ▶ Influences one or more physical variables
  - ▶ meet a control variable
  - ▶ reduce disturbances
- ▶ Compares actual value to reference value
  - ▶ minimize control deviation



## System

- ▶ Physical or technical construct
  - ▶ input signal – stimulus
  - ▶ output signal – response
- ▶ Transforms stimulus into response
- ▶ Symbolical illustration
  - ▶ block with marked signals
  - ▶ direction of signal effect expressed with arrows

## Input and output variables

- ▶ Change over time
  - ▶ expressed as  $u(t)$  and  $v(t)$  (dynamic system)
- ▶ Infinite number of possible variables
  - ▶ for real-world dynamic technical systems (in principle)
- ▶ Description of system behaviour based on desired application
  - ▶ using the relevant variables

## Given: dynamic system (to be controlled)

- ▶ Model describing dynamic system (e.g. Jacobian)
- ▶ Input variables – control variables
  - ▶ measured values (sensor data)
- ▶ Output variables – controlled variables
  - ▶ system input (force/torque data)

## Problem

- ▶ Keep control variable values constant **and / or**
- ▶ Follow a reference value **and / or**
- ▶ Minimize the influence of disturbances



## Sought: controller (for dynamic system)

- ▶ Implement hardware or software controller
- ▶ Alter controlled-variables (output)
- ▶ Based on control variables (input)
- ▶ Solve the problem



## Input

- ▶ Speed over ground
- ▶ Relative speed to traffic
- ▶ Distance to car in front
- ▶ Distance to car behind
- ▶ Weather conditions
- ▶ Relative position in road lane
- ▶ ...

## Output

- ▶ Throttle
- ▶ Brakes
- ▶ Steering

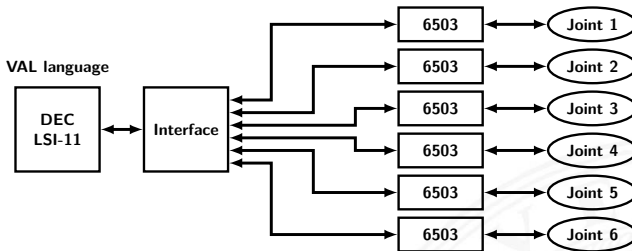
# Development of Control Engineering - Timeline

- 1788 J. Watt: engine speed governor
- 1877 J. Routh: differential equation for the description of control processes
- 1885 A. Hurwitz: stability studies
- 1932 A. Nyquist: frequency response analysis
- 1940 W. Oppelt: frequency response analysis, Control Engineering becomes an independent discipline
- 1945 H. Bode: discipline new methods for frequency response analysis
- 1950 N. Wiener: statistical methods
- 1956 L. Pontrjagin: optimal control theory, maximum principle
- 1957 R. Bellmann: dynamic programming
- 1960 direct digital control
- 1965 L. Zadeh: Fuzzy-Logic
- 1972 Microcomputer use
- 1975 Control systems for automation
- 1980 Digital device technology
- 1985 Fuzzy-controller for industrial use
- 1995 Artificial neuronal networks for industrial use

As the problem of trajectory-tracking:

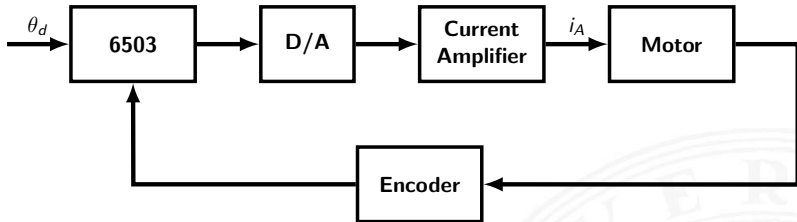
- ▶ Joint space: PID, plus model-based
- ▶ Cartesian space: joint-based
  - ▶ using kinematics or using inverse Jacobian calculation
- ▶ Adaptive: model-based adaptive control, self-tuning
  - ▶ controller (structure and parameter) adapts to the time-invariant or unknown system-behavior
  - ▶ basic control circle is superimposed by an adaptive system
  - ▶ process of adaption consists of three phases
    - ▶ identification
    - ▶ decision-process
    - ▶ modification
- ▶ Hybrid force and position control is still a current research topic

# Control System Architecture of PUMA-Robot



- ▶ two-level hierarchical structure of control system
- ▶ *DEC LSI-11* sends joint values at 35.7 Hz (28 ms)
  - ▶ trajectory
- ▶ Distance of actual value to goal value is interpolated
  - ▶ using 8,16,**32** or 64 increments

# Control System Architecture of PUMA-Robot (cont.)



- ▶ The joint control loop operates at 1143 Hz (0.875 ms)
- ▶ Encoders are used as position sensors
- ▶ Potentiometer are used for rough estimation (only PUMA-560)
- ▶ No dedicated speedometer
  - ▶ velocity is calculated as the difference of joint positions over time

- ▶ Placed inside the robot
- ▶ Monitor the internal state of the robot
  - ▶ e.g. position and velocity of a joint

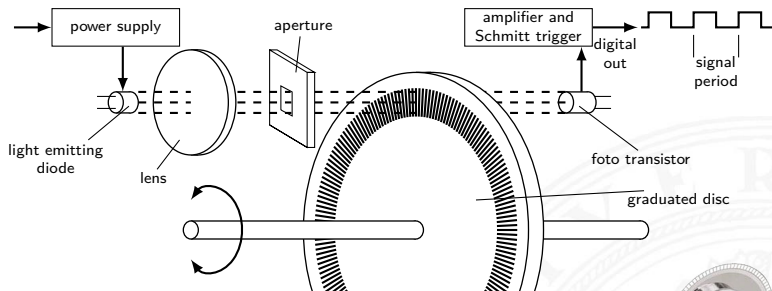
## Position measurement systems

- ▶ Potentiometer
- ▶ Incremental/absolute encoder
- ▶ Resolver

## Velocity measurement systems

- ▶ Speedometers
- ▶ Calculate from position change over time

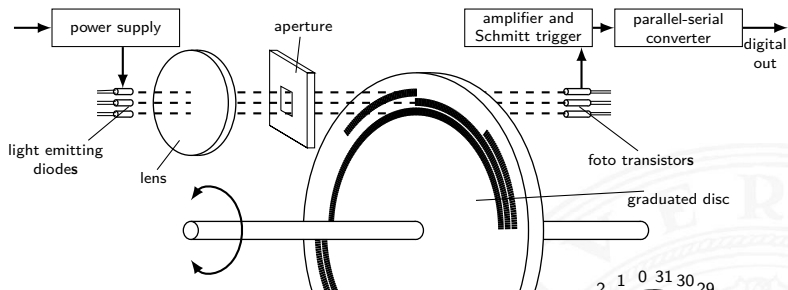
# Optical Incremental Encoders



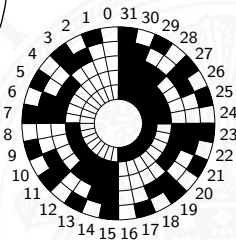
- ▶ An optical encoder reads the lines
- ▶ The disc is mounted to the shaft of the joint motor
  - ▶ PUMA-560: 1:1 ratio; .0001 rad/bit accuracy
- ▶ one special line is marked as the “zero-position”



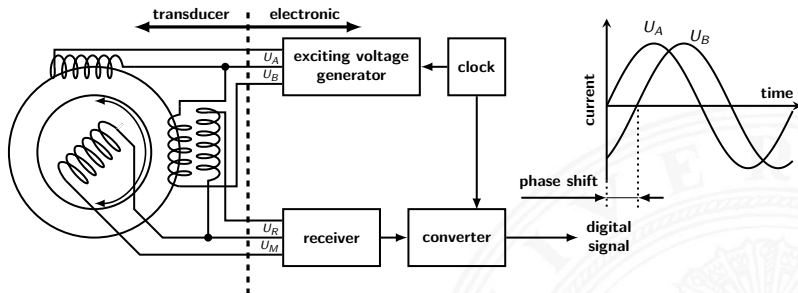
# Optical Absolute Encoder



- ▶ multiple LEDs and foto transistors
- ▶ e.g. 5 bit dual code gives 32 angular positions and  $11.25^\circ$  resolution
- ▶ parallel-serial converter required
- ▶ absolute positioning and direction encoding

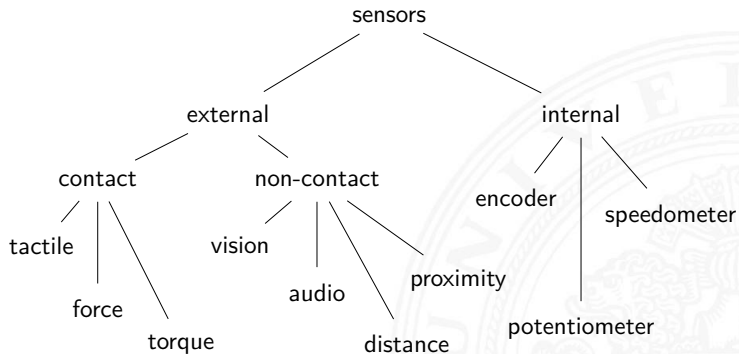




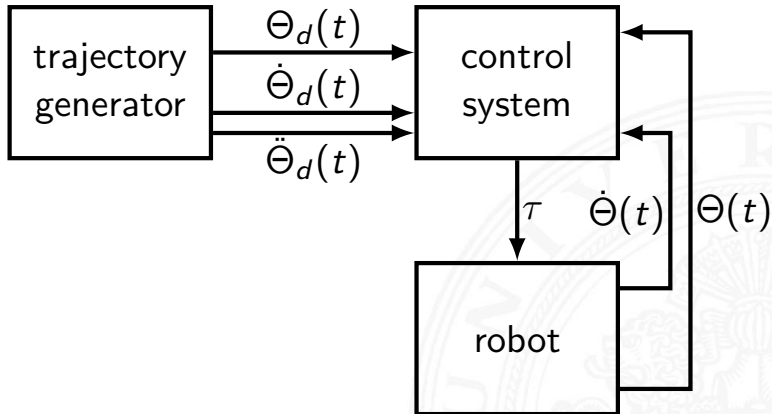


- ▶ analog rotation encoding
- ▶ phase shift between  $U_A$  and  $U_B$  determines rotation
- ▶ precision depending on digital converter

# Sensor Classification Hierarchy



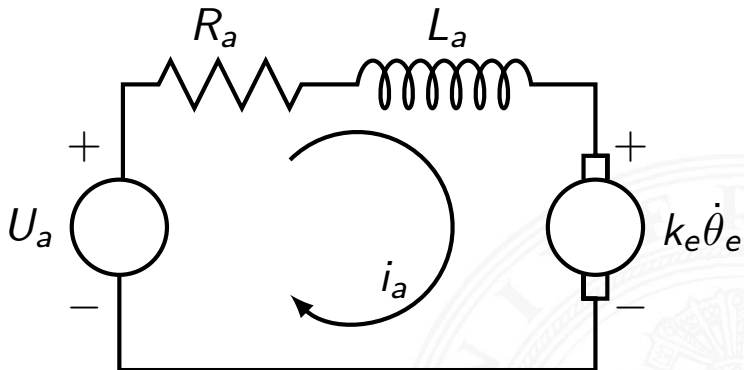
# Control System of a Robot



- ▶ Target values
  - ▶  $\Theta_d(t)$
  - ▶  $\dot{\Theta}_d(t)$
  - ▶  $\ddot{\Theta}_d(t)$
- ▶ Magnitude of error
  - ▶  $E = \Theta_d - \Theta, \dot{E} = \dot{\Theta}_d - \dot{\Theta}$
- ▶ Output (Control) value
  - ▶  $\Theta(t)$
  - ▶  $\dot{\Theta}(t)$
- ▶ Controlled value
  - ▶  $\tau$



# Simplified Circuit of a DC-Motor



$U_a$  input voltage of armature (motor) circuit

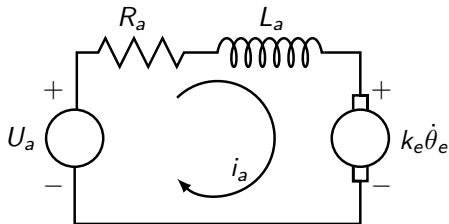
$R_a$  armature (motor) resistance

$L_a$  armature (coil) inductance

$i_a$  armature current (passing the motor)

$k_e$  exciter (motor) torque constant

# Simplified Circuit of a DC-Motor (cont.)



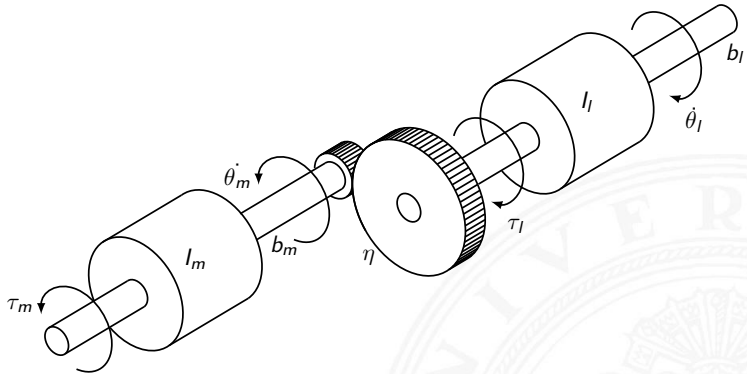
$U_a$  input voltage  
 $R_a$  armature resistance  
 $L_a$  armature inductance  
 $i_a$  armature current  
 $k_e$  exciter torque constant

The circuit can be described with the first order differential equation:

$$L_a \dot{i}_a + R_a i_a = U_a - k_e \dot{\theta}_e$$

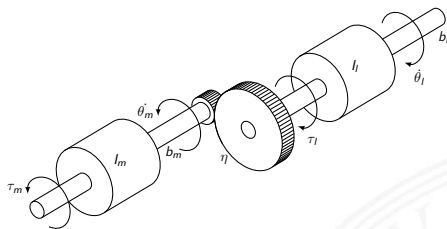
- ▶ Inductance relative to current change
- ▶ Resistance relative to absolute current
- ▶ Torque relative to rotation change

# Connection Between Motor and a Joint



- $\eta$  transmission ratio
- $I_{m/l}$  inertia of motor/load
- $\tau_{m/l}$  torque of motor/load
- $\dot{\theta}_{m/l}$  rotation velocity of motor/load
- $b_{m/l}$  friction factor

# Connection Between Motor and a Joint (cont.)



The motor torque formula is

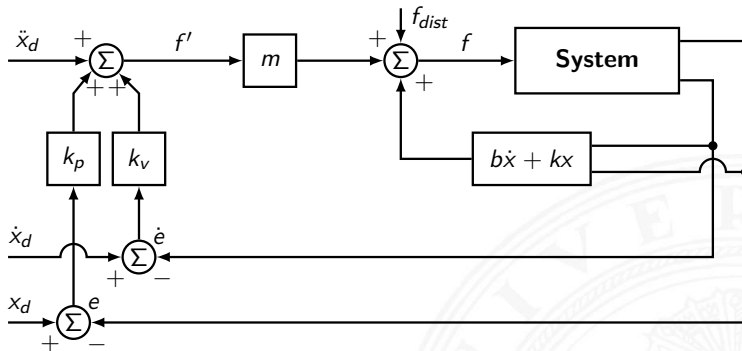
$$\tau_m = (I_m + I_l/\eta^2)\ddot{\theta}_m + (b_m + b_l/\eta^2)\dot{\theta}_m$$

and the load torque is

$$\tau_l = (I_l + \eta^2 I_m)\ddot{\theta}_l + (b_l + \eta^2 b_m)\dot{\theta}_l$$



# Linear Control for Trajectory Tracking



$$f' = \ddot{x}_d + k_v \dot{e} + k_p e + k_i \int e dt \quad (86)$$

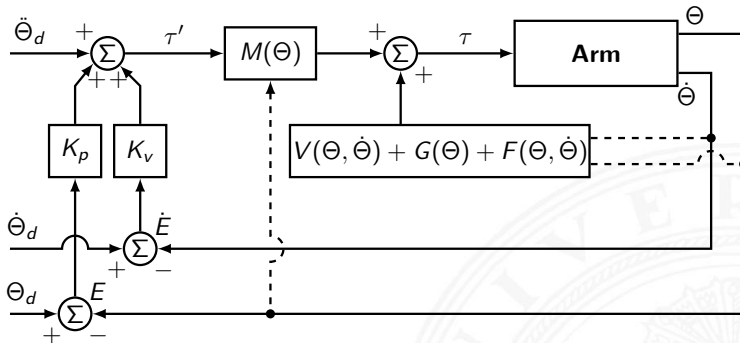
is called the principle of PID-control.

- P** Proportional controller:  $\tau(t) = k_p \cdot e(t)$   
The amplification factor  $k_p$  defines the sensitivity.
- I** Integral controller:  $\tau(t) = k_i \cdot \int_{t_0}^t e(t') dt'$   
Long term errors will sum up.
- D** Derivative controller:  $\tau(t) = k_v \cdot \dot{e}(t)$   
This controller is sensitive to changes in the deviation.

Combined  $\Rightarrow$  PID-controller:

$$\tau(t) = k_p \cdot e(t) + k_v \cdot \dot{e}(t) + k_i \int_{t_0}^t e(t') dt'$$

# Model-Based Control for Trajectory Tracking



The dynamic equation:

$$\tau = M(\Theta)\ddot{\Theta} + V(\Theta, \dot{\Theta}) + G(\Theta)$$

where  $M(\Theta)$  is the position-dependent  $n \times n$ -mass matrix of the manipulator,  $V(\Theta, \dot{\Theta})$  is a  $n \times 1$ -vector of centripetal and Coriolis factors, and  $G(\Theta)$  is a complex function of  $\Theta$ , the position of all joints of the manipulator.

## Scientific Research

- ▶ model-based control
- ▶ adaptive control

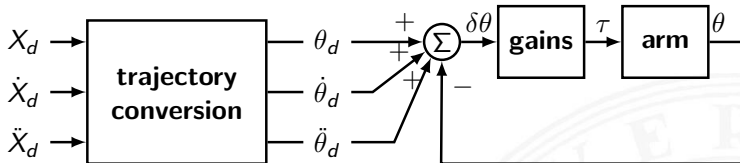
## Industrial robotcs

- ▶ PID-control system with gravity compensation

$$\tau = \dot{\Theta}_d + K_v \dot{E} + K_p E + K_i \int E dt + \hat{G}(\Theta)$$

# Control in Cartesian Space – Method I

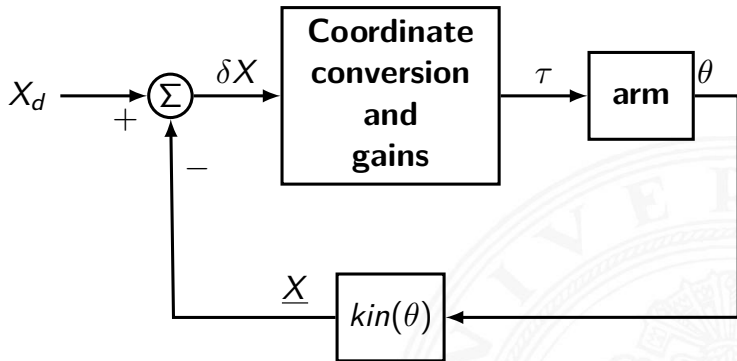
## Joint-based control with Cartesian trajectory input



- ▶ cartesian trajectory is converted into joint space first
- ▶ joint space trajectory is sent to the controller
- ▶ trajectory controller sends joint targets to motor controllers
- ▶ motor controller sends torque data to motor
- ▶ sensors output joint state

# Control in Cartesian Space – Method II

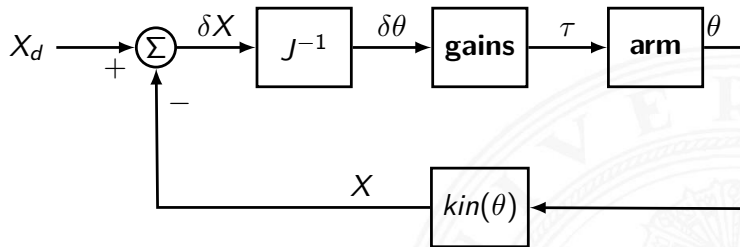
## Cartesian control via calculation of kinematics



- ▶ controller operates in cartesian space
- ▶ joint space conversion within control cycle
- ▶ error values in cartesian space using FK

# Control in Cartesian Space – Method III

## Cartesian control via calculation of inverse Jacobian



- ▶ no explicit joint space conversion
- ▶ dynamic conversion using inverse Jacobian

## Motivation

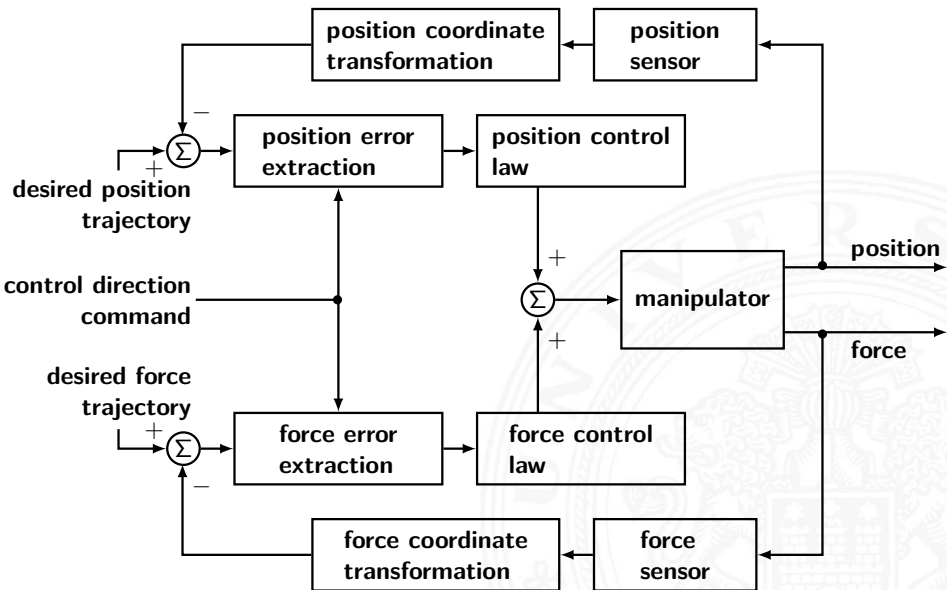
Certain tasks require control of both: position and force of the end-effector:

- ▶ assembly
- ▶ grinding
- ▶ opening/closing doors
- ▶ crank winding
- ▶ ...

An example shows two feedback loops for separate control of position and force



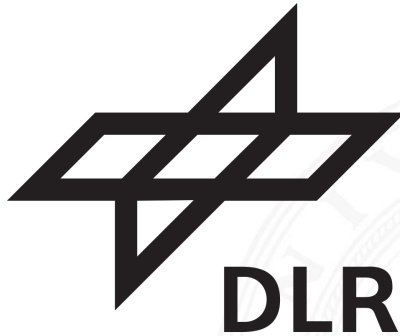
# Hybrid Control of Force and Position (cont.)



# Hybrid Force/Torque Control for safe HRI

Robot Control - Control System of a Robot

Introduction to Robotics





Universität Hamburg

DER FORSCHUNG | DER LEHRE | DER BILDUNG

MIN Faculty  
Department of Informatics



# Introduction to Robotics

## Lecture 10

**Lasse Einig, Jianwei Zhang**

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University of Hamburg  
Faculty of Mathematics, Informatics and Natural Sciences  
Department of Informatics

Technical Aspects of Multimodal Systems

July 12, 2018



Introduction

Coordinate systems

Kinematic Equations

Robot Description

Inverse Kinematics for Manipulators

Differential motion with homogeneous transformations

Jacobian

Trajectory planning

Trajectory generation

Dynamics

Principles of Walking

Robot Control

Task-Level Programming and Trajectory Generation



# Outline (cont.)

Object Representation  
Motivation of Path Planning  
Configuration of an Artifact  
Geometrical Path Planning

Task-level Programming and Path Planning

Task-level Programming and Path Planning

Architectures of Sensor-based Intelligent Systems

Summary

Conclusion and Outlook





**Goal** enable task-specification with symbolically described states  
**where** planning of necessary movement is up to the robot system

**Example** driving commands should only require the target position  
instead of specifying how to move precisely

## Common problem of task-level programming

### **Collision avoidance**

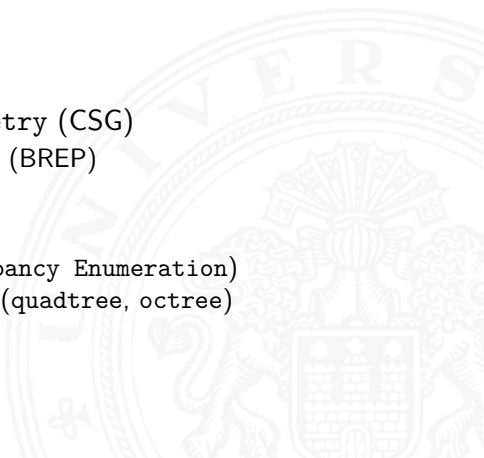
A general approach – geometric trajectory planning:  
to plan collision-free motion for the known models of manipulators  
and obstacles in the workspace.



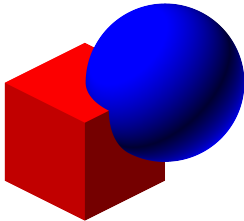
# Object-Representation

## of robots, the environment and objects

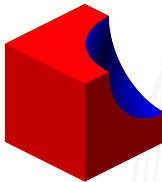
- ▶ Approximating methods
  - ▶ bounding box
  - ▶ convex hull
  - ▶ spherical and ellipse models
- ▶ Constructive Solid Geometry (CSG)
  - ▶ Boundary Representation (BREP)
  - ▶ Sweep Representation
- ▶ Spatial data structures
  - ▶ Grid-Model (Spatial Occupancy Enumeration)
  - ▶ Hierarchical Representation: (quadtrees, octrees)



- ▶ Method to model bodies
- ▶ Direct modeling
- ▶ Design of complex surfaces
- ▶ Combination of basic shapes using the boolean operators



union



difference

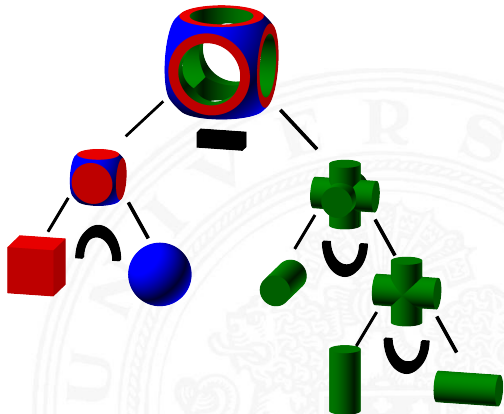
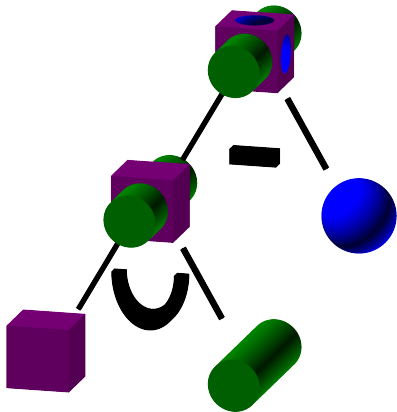


intersection



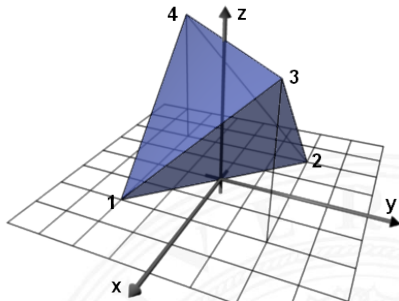
# CSG Representation (cont.)

## ► CSG-Tree



# Boundary Representation

- ▶ Method to model bodies
- ▶ Indirect modeling
- ▶ Surface / Volume model
- ▶ **V**ertice-**E**dge-**S**urfaces



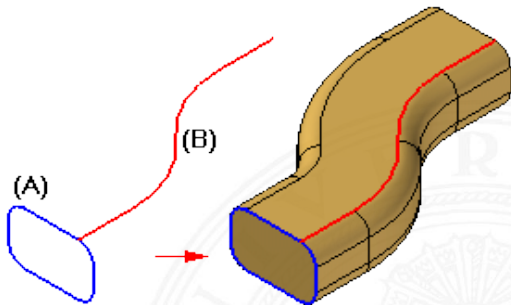
Edge-#	V-# <sub>1</sub>	V-# <sub>2</sub>
1	1	2
2	2	3
3	1	3
4	1	4
5	2	4
6	3	4

V-#	x	y	z
1	2	-2	0
2	-2	2	0
3	2	2	4
4	-2	-2	4

Surface-#	Edge order
1	1-2-3
2	3-6-4
3	2-5-6
4	1-4-5

# Sweep Representation

- ▶ method to model bodies
- ▶ models in 2.5D
- ▶ intuitive
- ▶ quadratic, cubic polynomials

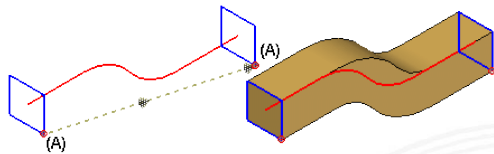


A 2D-shape

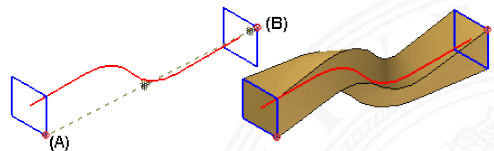
B extrusion path

# Sweep Representation (cont.)

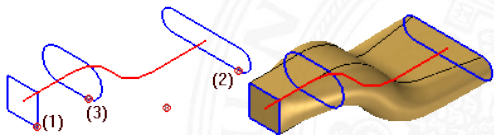
Simple path



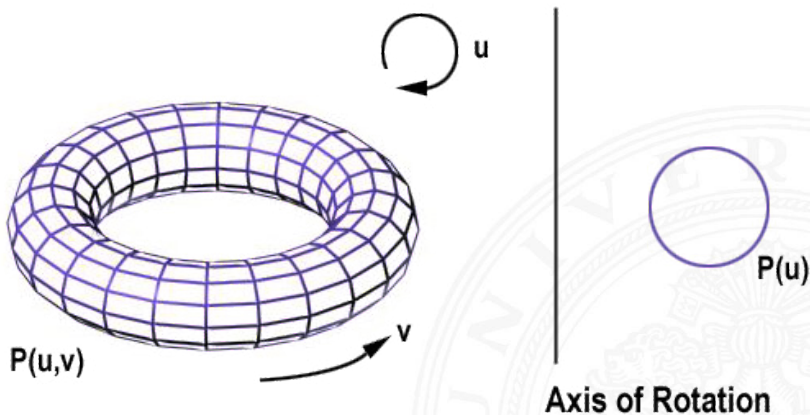
Twisted path



Shape modification

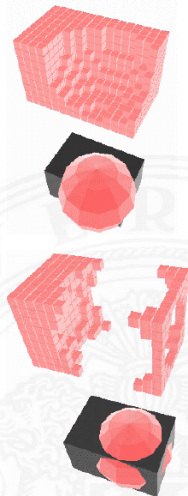


# Sweep Representation (cont.)



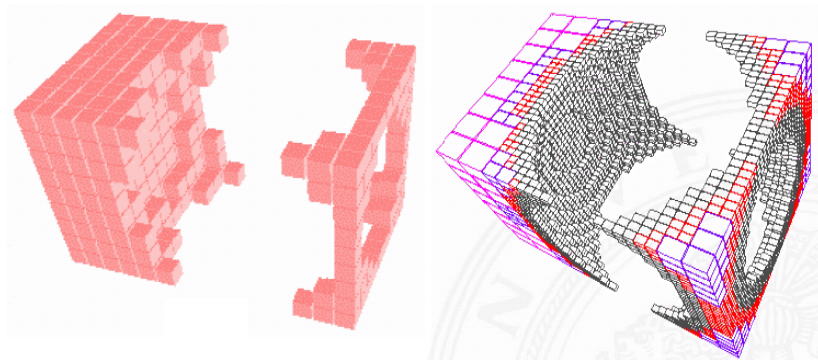
# Grid-Model (Spatial Occupancy Enumeration)

- ▶ Volume model in virtual space
- ▶ Enclosed hull
- ▶ Voxel based
- ▶ Unambiguous definition from inside and outside
- ▶ Easy check for collisions between objects
- ▶ Representation using CSG or BREP



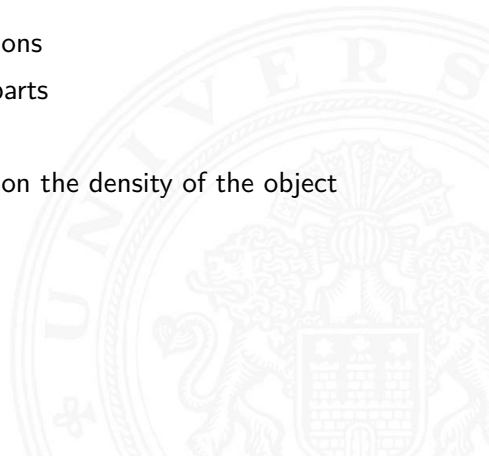


# Grid-Model (Spatial Occupancy Enumeration) (cont.)



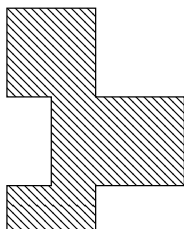


- ▶ 2D modeling
- ▶ Taken over from DB-applications
- ▶ Surface is partitioned into 4 parts
- ▶ Indexing of created surfaces
- ▶ Level of partitioning depends on the density of the object
- ▶ Octree is the 3D-equivalent





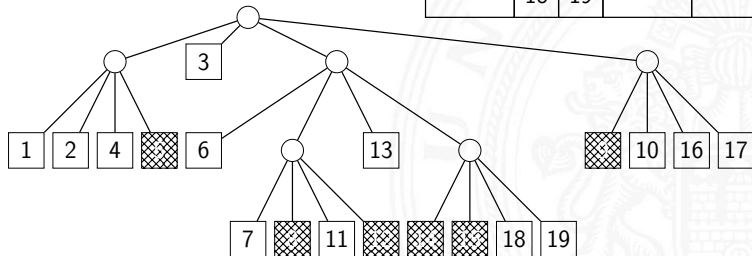
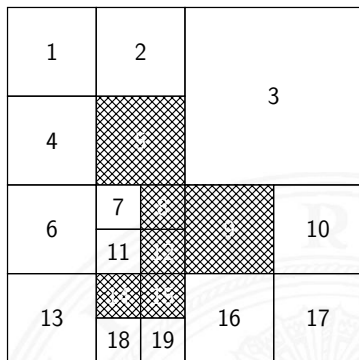
# Quadtree Representation (cont.)



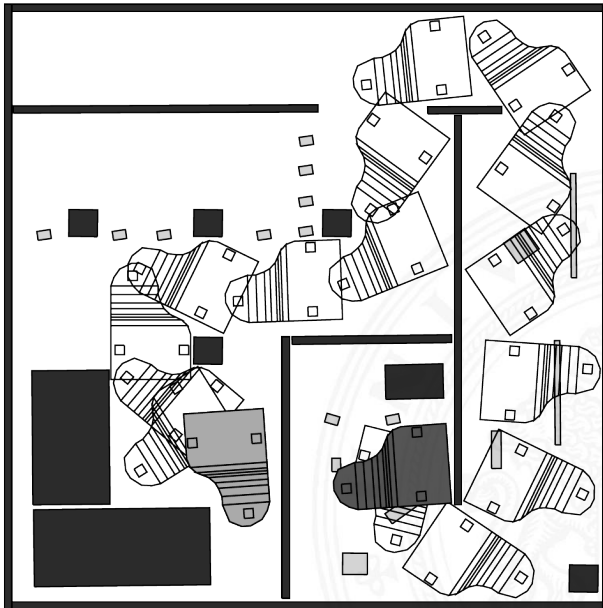
○ Node with descendants

□ Node representing an empty block

▣ Node representing a material block



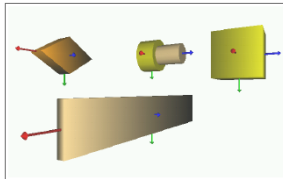
# Piano Mover Problem



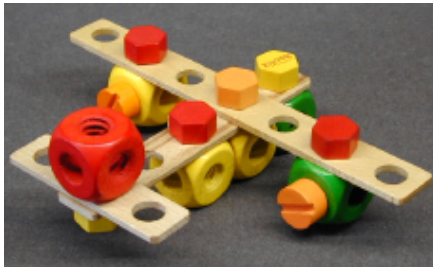
# Puzzle solving



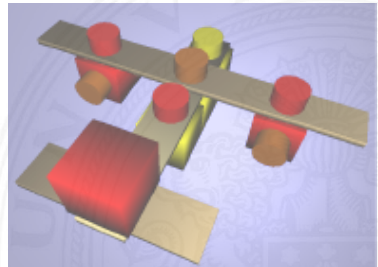
# Assembly Strategies



assembly parts



physical assembled plane



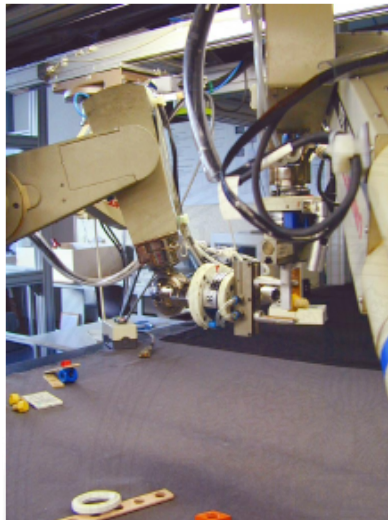
simulated assembled plane

Learning of Assembly Strategies in a distributed Multi-Robot-Environment [8]

# Assembly Strategies (cont.)

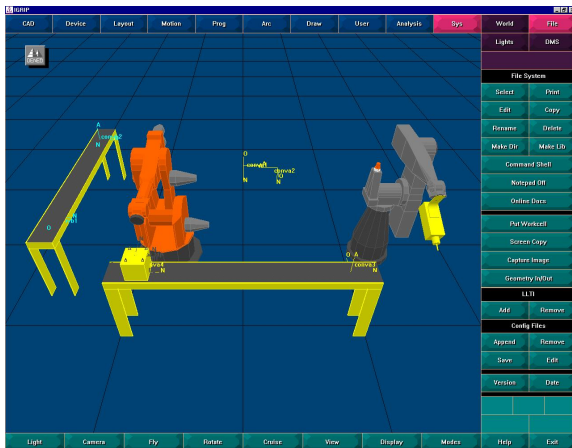


assembly start



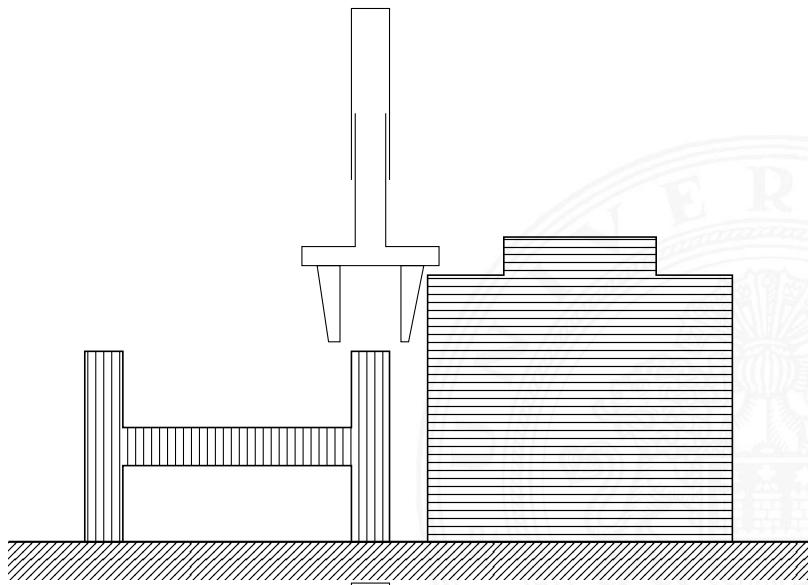
during assembly

# Robot Programming





# Positioning of a Gripper



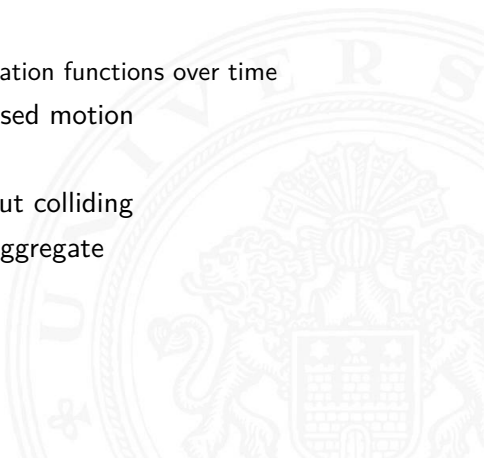


Tasks comprised:

- ▶ Geometric paths
- ▶ Trajectories
  - ▶ position, velocity and acceleration functions over time
- ▶ Instruction order for sensor-based motion

Goals comprised:

- ▶ Motion to goal position without colliding
- ▶ Autonomous assembly of an aggregate
- ▶ Spatial recognition





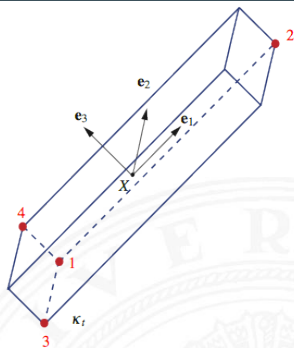
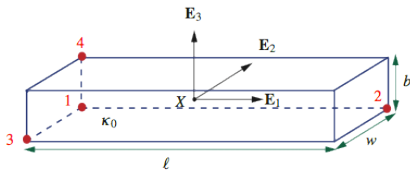
## Artifact

A virtual or real body, that can change its place and form over time.

A configuration of an artifact is a set of independent parameters, which define the position of all its points in a reference frame.

- ▶ Can be expressed as a geometrical state-vector
- ▶ Number of parameter for the specification of the configuration is equal to the degrees of freedom

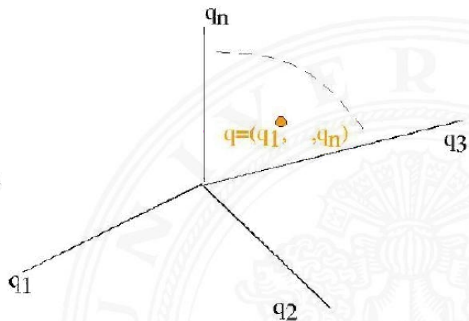
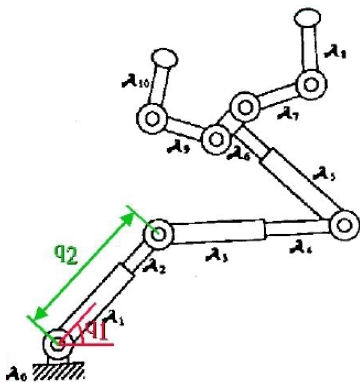
# Configurations of a Rigid Body



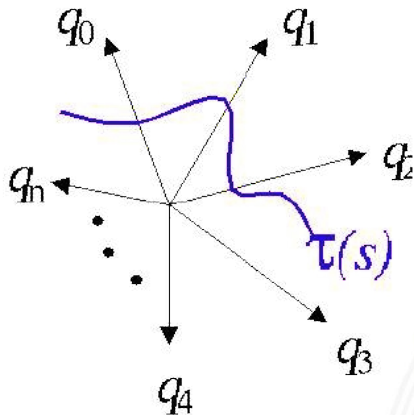
## Configuration of an object

- ▶ 2D:  $(x, y, \theta)$
- ▶ 3D:  $(x, y, z, \alpha, \beta, \gamma)$
- ▶ Plane: (longitude, latitude, altitude, roll, pitch, yaw)

# Configurations of a Multi-joint Manipulator



# Configurations and Paths of a Human Body



## Path

A steady curve, connecting two configurations

$\tau : s \in [0, 1], \tau(s) \in \text{configuration space}$



# Definition

## Basic path problem

### Generalized motion problem

*"Given a number  $m$  of static obstacles and an artifact with  $d$  degrees of freedom, the task of geometrical path planning is to determine a path between two configurations without collisions."*

A complete path-planner shall always deliver a valid plan if one exists, otherwise it should notify about the non-existence of a path.



Known are:

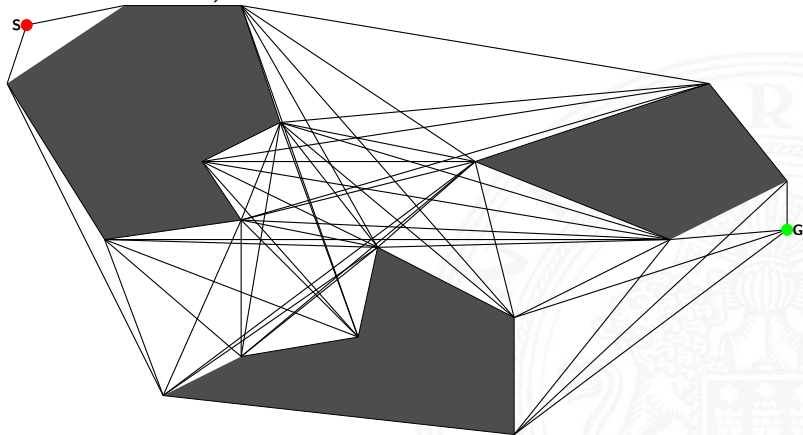
- ▶ Completely a priori modeled geometry of the artifact and the obstacles
- ▶ Kinematics of the artifact (a rigid body or a body with alterable shape)
- ▶ Start and goal configuration

To determine:

- ▶ Sequence of steady transformations of collision-free configurations of the artifact from the start to the goal configuration

# Visibility Graph

The Visibility Graph (V-Graph) is constructed by linking the visible corner points of the obstacles (visible: line does not intersect obstacle).



Complexity:  $O(m^2)$ ,  $m$  is the no. of obstacle polygon vertices



# Tangent Graph

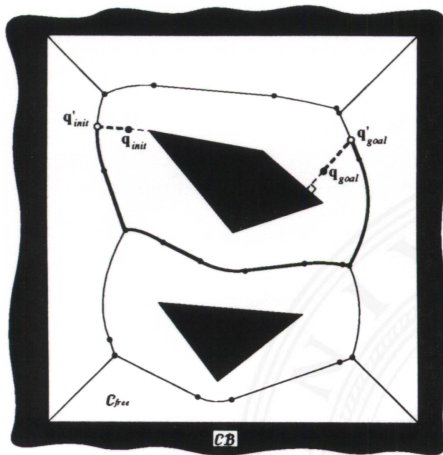
The Tangent Graph (T-Graph) was introduced as a subgraph of the V-Graph. It can be proven, that the shortest route between the start and goal is a subset of the T-graph.



Complexity:  $O(m^2)$



# Voronoi Diagram



Construction complexity:  $O(m \log m)$

Search complexity:  $O(m)$

- ▶  $A^*$ -algorithm is used to find the least-cost path
- ▶ Search a path from the initial node  $\mathbf{s}$  to (one of) the goal node(s)  $\mathbf{z}$
- ▶ A heuristic cost function  $f$  is used, which assigns a value to every route from the initial to an arbitrary node  $\mathbf{q}$
- ▶ This value is used to estimate the complete costs from the initial node to the goal node (passing node  $\mathbf{q}$ )
- ▶ The estimation function  $f$  can be defined as an addition of two functions  $g$  and  $h$ 
  - ▶  $g$  describes the known cost from the initial node to node  $\mathbf{q}$
  - ▶  $h$  estimates the cost of the shortest route from  $\mathbf{q}$  to the goal node  $\mathbf{z}$
- ▶ If  $h$  is chosen the way that the actual costs are not over-estimated, the search algorithm is called  $A^*$

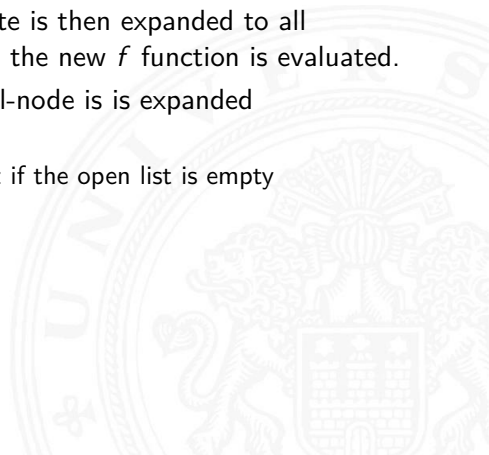
# Heuristical Search (cont.)

- ▶ It is guaranteed, that the shortest existing route can be found with the  $A^*$ -algorithm
- ▶ In order to find not only the shortest, but also the smoothest route, the costs of a route contain also a factor for direction changes.  $g$  and  $h$  are defined such that
  - ▶  $g = e(s, q) + w_f \cdot c_f(s, q)$
  - ▶  $h = e(q, z) + w_f \cdot c_f^*(q, z)$
  - ▶  $e(x, y)$  is the euclidean distance from  $x$  to  $y$
  - ▶  $w_f$  is a weight factor for the smoothness of the route
  - ▶  $c(x, y)$  is the measure of curvature of the route from  $x$  to  $y$ 
    - ▶ \* this value has to be estimated
- ▶ All possible route candidates from  $s$  to  $q$  are inserted into an open list
- ▶ The route candidate with the minimal  $f$ -value is moved from the open list to the closed list



# Heuristical Search (cont.)

- ▶ This closed list route candidate is then expanded to all reachable neighbor-nodes and the new  $f$  function is evaluated.
- ▶ This is repeated until the goal-node is expanded
  - ▶ a route has been found
  - ▶ there is no route from  $s$  to  $z$  if the open list is empty





# A\* path finding





## First lower boundary

PSPACE-hard, i.e. at least as complex as an NP-problem, in the worst case an exponential computing time for every algorithm to solve this problem [9]

## First upper boundary

Double exponential time-complexity with the DOF  $d$  [10]

## Second upper boundary

Single exponential time-complexity using silhouette-method [11]



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# Introduction to Robotics

## Lecture 11

**Lasse Einig, Jianwei Zhang**

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University of Hamburg  
Faculty of Mathematics, Informatics and Natural Sciences  
Department of Informatics

**Technical Aspects of Multimodal Systems**

July 12, 2018



Introduction

Coordinate systems

Kinematic Equations

Robot Description

Inverse Kinematics for Manipulators

Differential motion with homogeneous transformations

Jacobian

Trajectory planning

Trajectory generation

Dynamics

Principles of Walking

Robot Control

Task-Level Programming and Trajectory Generation







# Outline (cont.)

## Task-level Programming and Path Planning

Work space to Configuration Space

C-obstacles

Partition Representation of the C-Space

## Task-level Programming and Path Planning

Architectures of Sensor-based Intelligent Systems

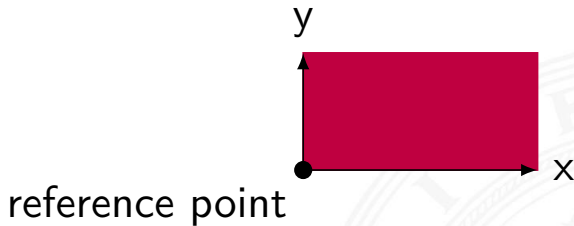
Summary

Conclusion and Outlook



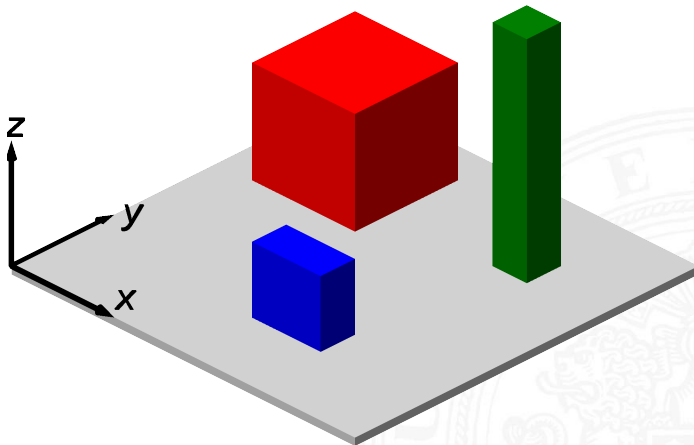


**Robot** Single reference point with physical attributes



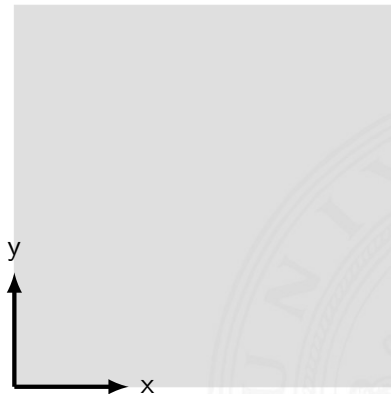


**Work space** The cartesian space of the environment





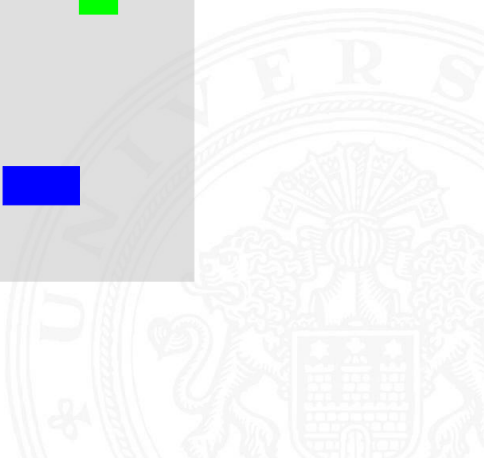
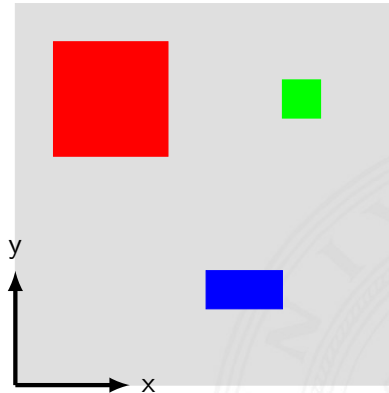
Configuration space  $\mathcal{C}$  Set of all possible configurations





# Task-level Programming – Basics

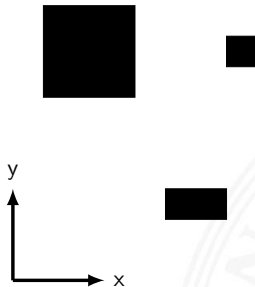
Obstacles in work space C-Obstacles in configuration space





# Task-level Programming – Basics

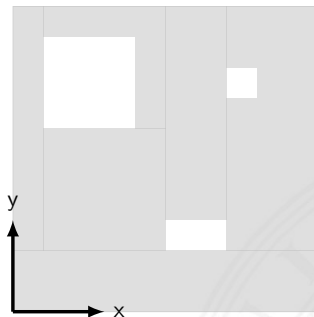
Obstacle space  $C_{\text{obstacle}}$  Union of C-Obstacles





# Task-level Programming – Basics

Free space  $C_{free}$  the complement of Obstacle space



**Robot** Single reference point with physical attributes

**Work space** The cartesian space of the environment

**Configuration space  $C$**  Set of all possible configurations

**Obstacles in work space**  $C$ -Obstacles in configuration space

**Obstacle space  $C_{\text{obstacle}}$**  Union of  $C$ -Obstacles

**Free space  $C_{\text{free}}$**  the complement of Obstacle space

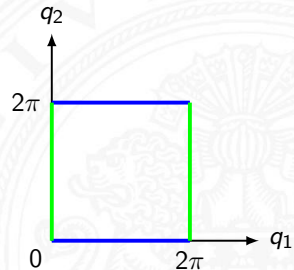
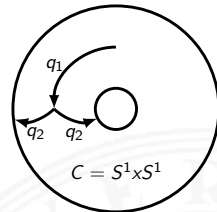
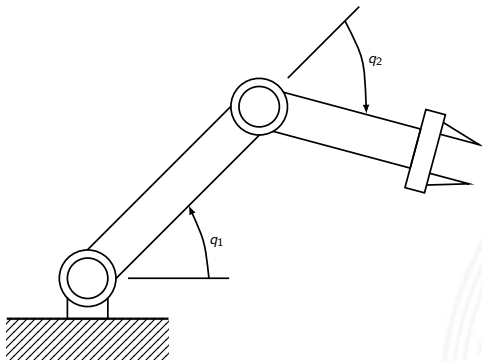
**Path-planning** for Work-/Configuration-Space

Search for a path for the reference point of the artifact in the free space.

Configurations of the artifact in free space have no intersection with obstacles

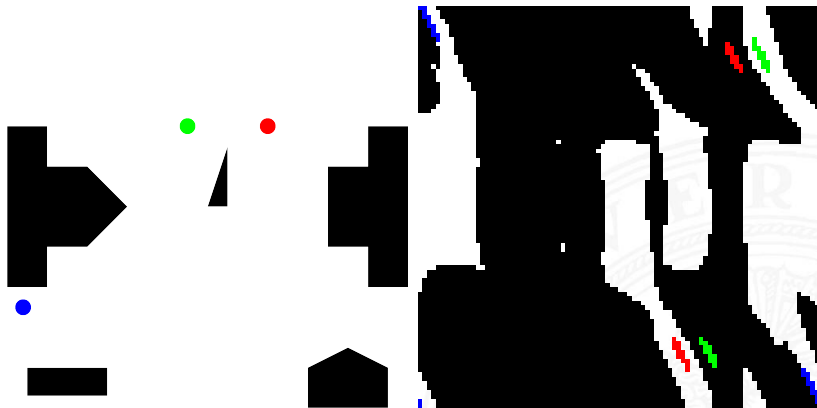


# Work Space to Configuration Space – Illustration





# Work Space to Configuration Space – Example



Discretized workspace  $x^{scale} = 2000$ ,  
 $y^{scale} = 1600$

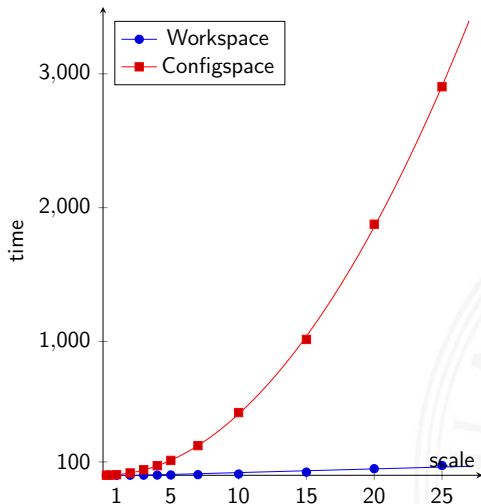
Discretized configuration space  
 $q_1^{scale} = 90$ ,  $q_2^{scale} = 90$

# Work Space to Configuration Space – Example



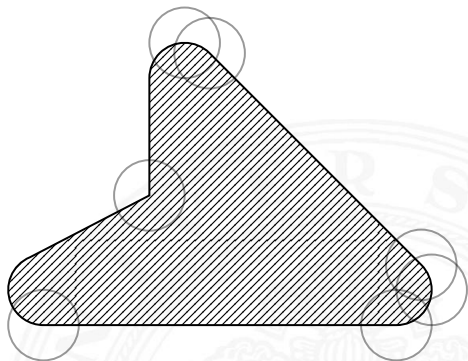
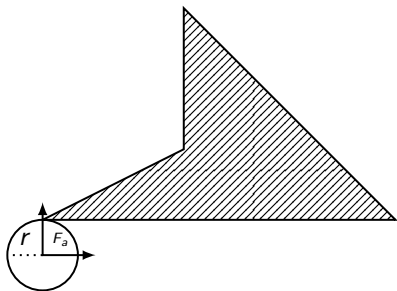
Discretized configuration space  
 $q_1^{scale} = 3600, q_2^{scale} = 3600$

# Work Space to Configuration Space – Complexity



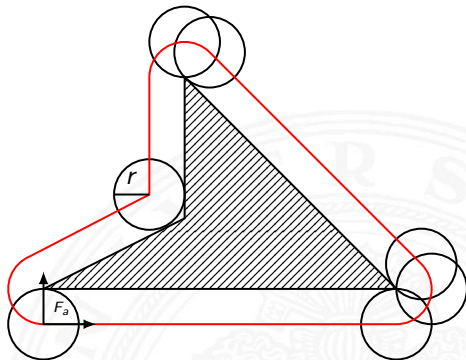
- ▶ Python
- ▶ Brute forward kinematics
- ▶ using polygon collisions
  - ▶ shapely library
- ▶ 56 cpus
  - ▶ Intel® Xeon® E5-2690 v4 (2.60GHz)

# C-Obstacle for a circular artifact



Obstacle & artifact (radius  $r$ ) Expanded  
C-Obstacle

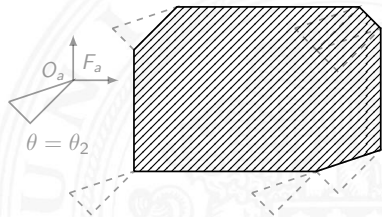
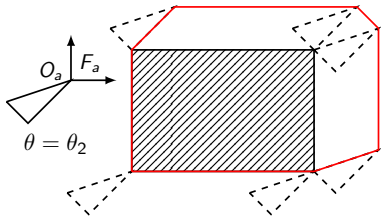
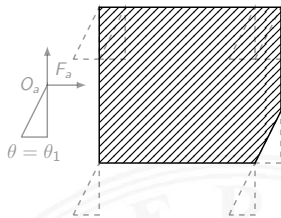
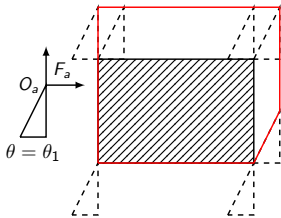
# C-Obstacle for a circular artifact



Obstacle & artifact (radius  $r$ )

Path of minimal distance to obstacle

# C-Obstacle for Polygons



Obstacle & polygon artifact with  $\theta = \theta_1 \vee \theta_2$ ; minimum distance to obstacle.



A C-Obstacle of a fixed, convex obstacle with respect to a moving convex robot (part) may be theoretically represented as the Minkowski Sum of the corresponding objects.

$C_O(H)$  is the C-obstacle of a fixed convex polyhedra  $H$ , with respect to the (moving) convex object  $O$ .

**Minkowski-Sum (Minkowski-Difference) of  $H$  and  $O$  ( $H$  and  $-O$ )**

$$C_O(H) = H \ominus O = H \oplus (\ominus O)$$

where

$$H \ominus O := \{h - o \mid h \in H \wedge o \in O\}$$

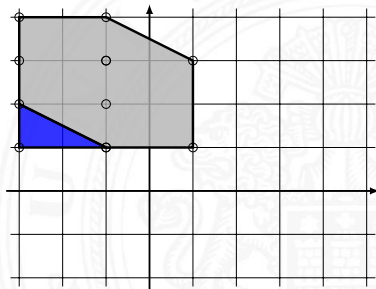
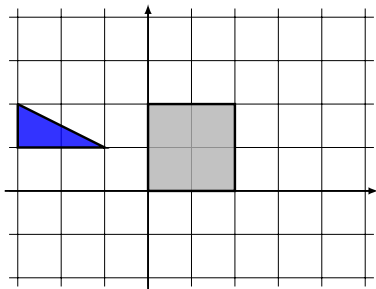
# Minkowski Sum & Difference – 2D Example

$$A = \{(0, 0), (2, 0), (2, 2), (0, 2)\} \quad B = \{(-1, 1), (-3, 2), (-3, 1)\}$$

$$A \oplus B = \{(-1, 1), (-3, 2), (-3, 1), (1, 1), (-1, 2), (-1, 1), \\ (1, 3), (-1, 4), (-1, 3), (-1, 3), (-3, 4), (-3, 3)\}$$

The convex hull (eliminating duplicates & inner points)

$$\text{conv}\{A \oplus B\} = \{(-3, 1), (1, 1), (1, 3), (-1, 4), (-3, 4)\}$$



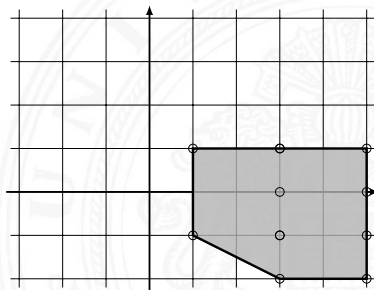
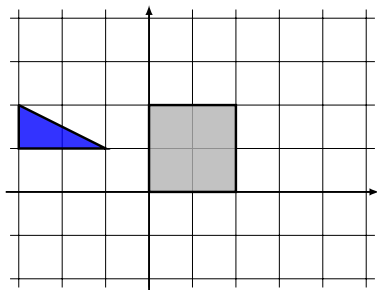
# Minkowski Sum & Difference – 2D Example (cont.)

$$A = \{(0, 0), (2, 0), (2, 2), (0, 2)\} \quad B = \{(-1, 1), (-3, 2), (-3, 1)\}$$

$$A \ominus B = \{(1, -1), (3, -2), (3, -1), (3, -1), (5, -2), \\ (5, -1), (3, 1), (5, 0), (5, 1), (1, 1), (3, 0), (3, 1)\}$$

The convex hull (eliminating duplicates & inner points)

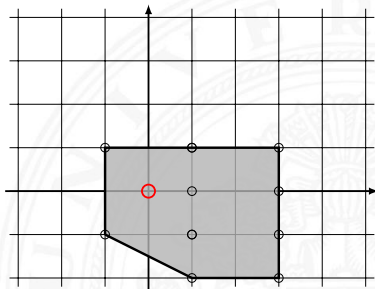
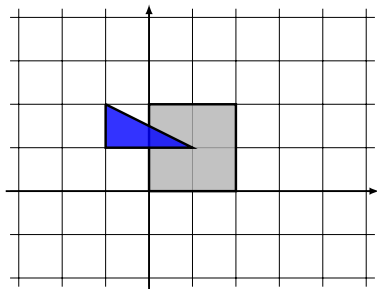
$$\text{conv}\{A \ominus B\} = \{(1, -1), (3, -2), (5, -2), (5, 1), (1, 1)\}$$



# Minkowski Sum & Difference – 2D Example (cont.)

## Collision detection

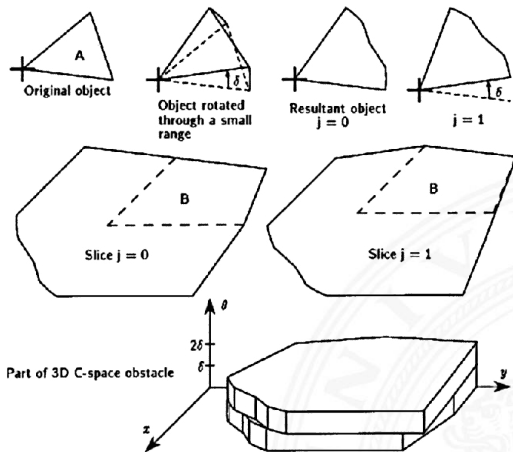
Two objects are colliding, if their Minkowski difference contains the origin of the coordinate frame.



There is an interactive applet on the web:

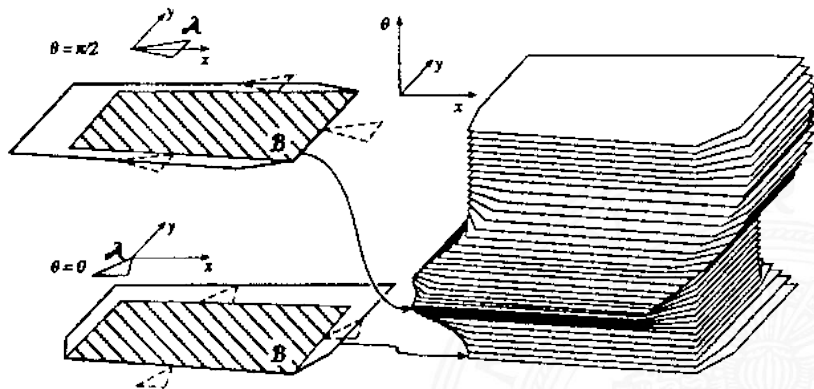
<http://www.cut-the-knot.org/Curriculum/Geometry/PolyAddition.shtml>

# C-Obstacles for 2-D translation and 1-D rotation



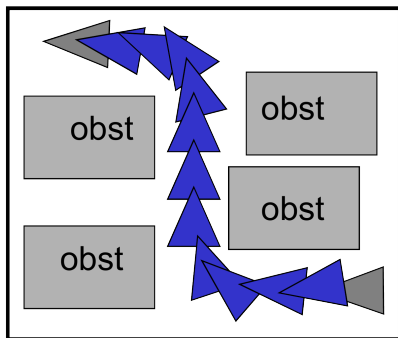
Represent rotational configuration of the C-obstacle as slice for each  $\theta$  configuration of the robot.

# C-Obstacles for 2-D translation and 1-D rotation (cont.)

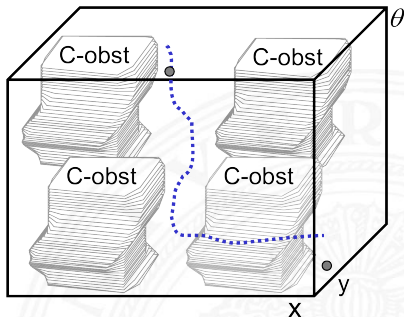


The configuration space for a  $k$ -DOF robot is a  $k$ -Dimensional coordinate system.

# C-Obstacles for 2-D translation and 1-D rotation (cont.)

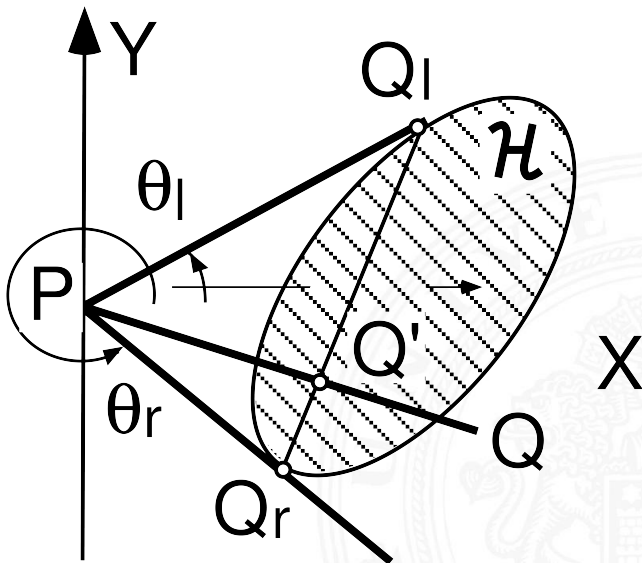


Work space  $(x, y)$



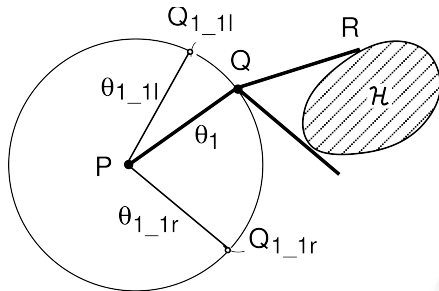
Configuration space  $(x, y, \theta)$

# C-obstacles of a pole

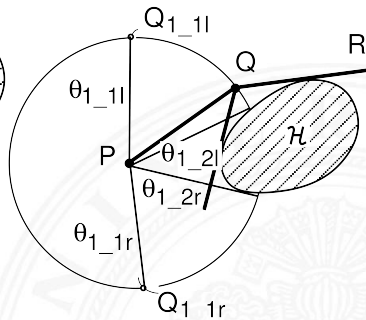




# C-obstacles of a 2-DOF Chain of Poles

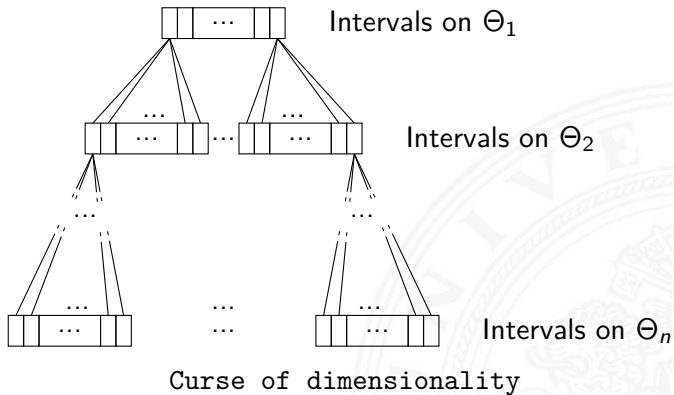


(1)

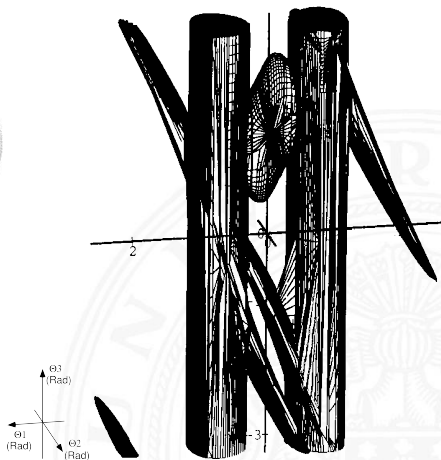
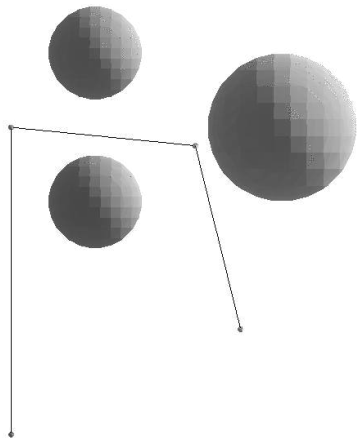


(2)

# Tree-structure for Configuration Space partitioning



# Configuration Space of a 3-DOF Chain of Poles





The free space is partitioned into cells using

- ▶ Geometrical partition
  - ▶ uniform cubes
  - ▶ a hierarchical tree-structure (Quad-tree, Oct-tree, etc.)
  - ▶ slices and scanlines
  - ▶ bubbles of variable size

The union of the non-overlapping cells is part of the free space.  
Neighborhood graphs represent the connectivity of free space.

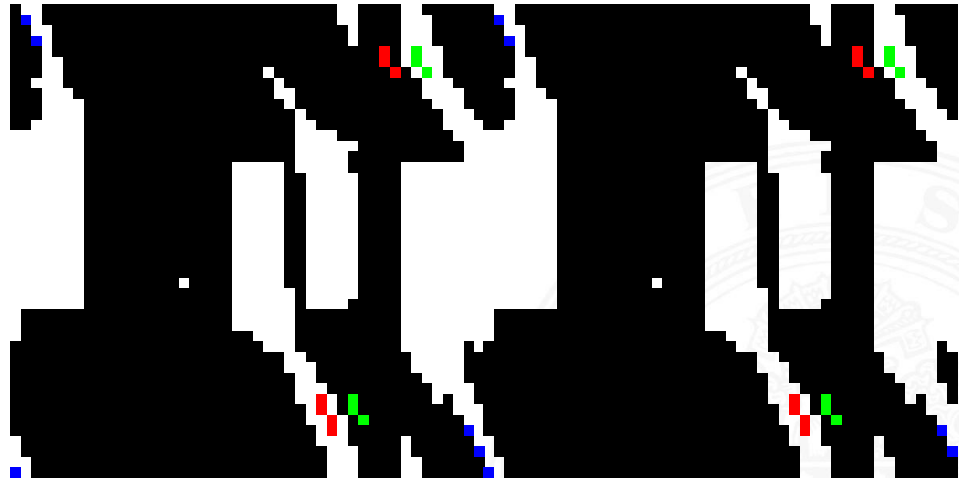
- ▶ Topological partition
  - ▶ overlapping generalized cones
  - ▶ critical points of the C-obstacle connection graph

The union of the overlapping cells is equal to the free space.



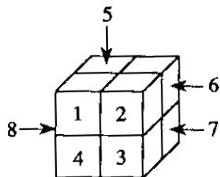
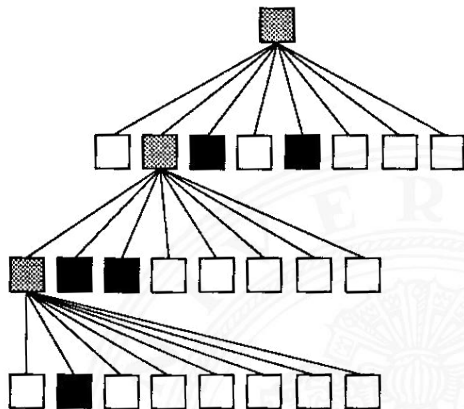
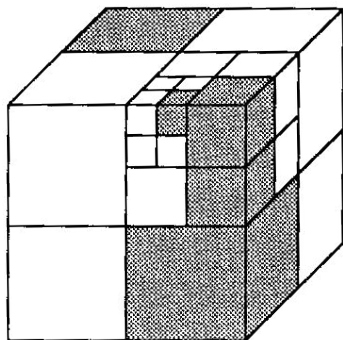


# Squares-Partitioning of Configuration Space (cont.)

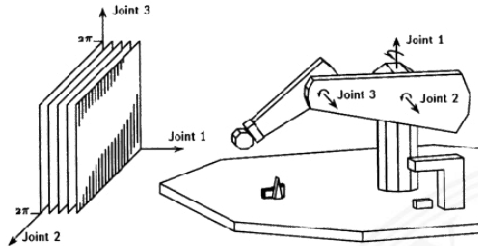


Bitmap of configuration space

# Partitioning of the configuration space using Octrees



# Partitioning of the configuration space using Slices



## Complexity regarding the transformation of the C-obstacles

$$r^{d-1}f(m)$$

where  $r$ : the number of discretization steps for each DOF,

$d$ : DOF of the robot arm

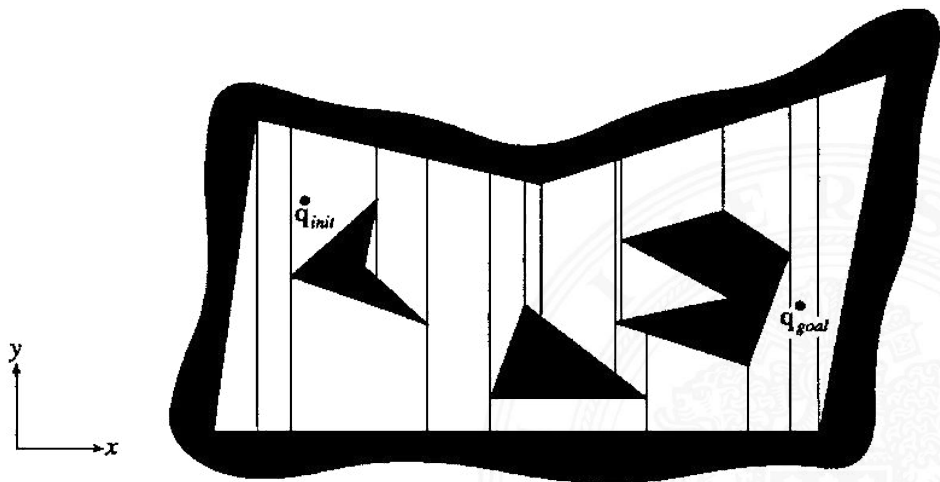
$f(m)$ : the computing time of one slice

$m$ : the number of edges of all obstacles



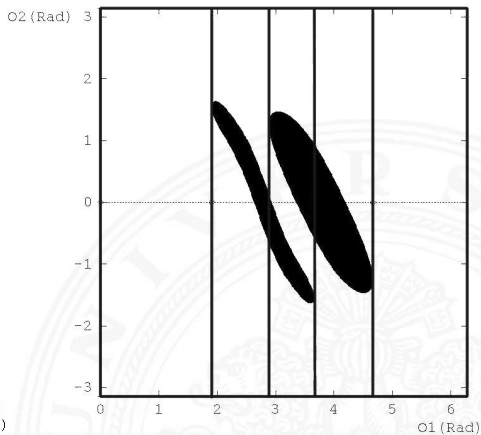
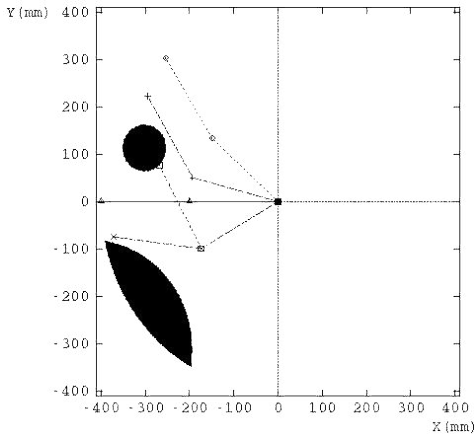


# Exact Partition of Configuration Space



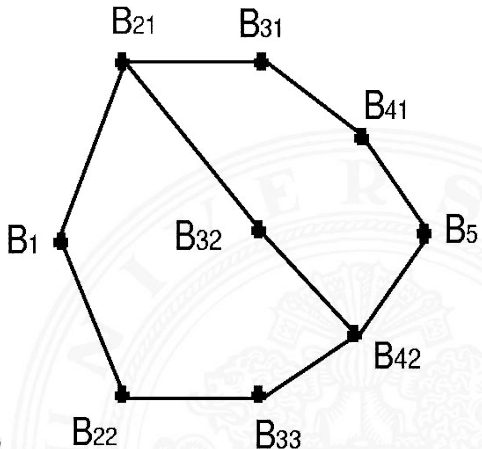
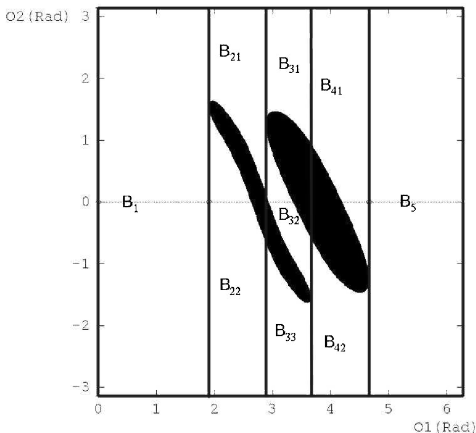
Trapezoidal partitioning of the configuration space

# Exact Partition of Configuration Space (cont.)



Cylindrical partitioning using critical points

# Exact Partition of Configuration Space (cont.)



Cylindrical partitioning and connectivity graph





## Advantages:

- ▶ Complete in case of sufficient resolution
- ▶ Global overview

## Disadvantages:

- ▶ High demand for RAM
  - ▶ Curse of Dimensionality
- ▶ Complex to implement
- ▶ Practically implementable only for few degrees of freedom



Path planning without explicit representation of free space?



next Lecture!



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# Introduction to Robotics

## Lecture 12

**Lasse Einig, Jianwei Zhang**

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University of Hamburg  
Faculty of Mathematics, Informatics and Natural Sciences  
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Technical Aspects of Multimodal Systems

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# Outline (cont.)

Task-level Programming and Path Planning

Task-level Programming and Path Planning

- Recapitulation

- Potential Field Method

- Probabilistic Approaches

- Application fields

- Extension of Basic Problem and Applications

- Practical Example: Path Planning with MoveIt

Architectures of Sensor-based Intelligent Systems

Summary

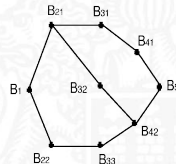
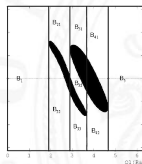
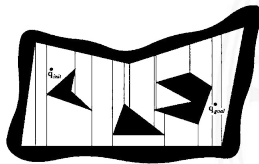
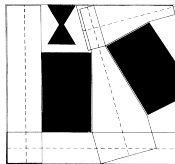
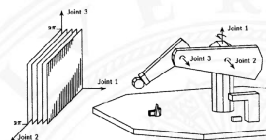
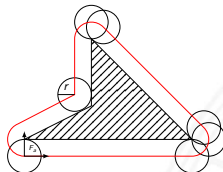
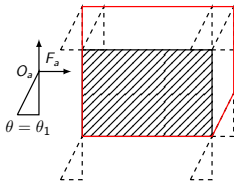
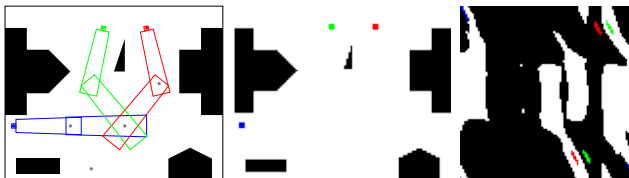
Conclusion and Outlook



# Partition based Path Planning – Methods

Task-level Programming and Path Planning - Recapitulation

Introduction to Robotics



## Advantages:

- ▶ Complete in case of sufficient resolution
- ▶ Global overview

## Disadvantages:

- ▶ High demand for RAM
  - ▶ Curse of Dimensionality
- ▶ Complex to implement
- ▶ Practically implementable only for few degrees of freedom



Path planning without explicit representation of free space?



this Lecture!

## Definition

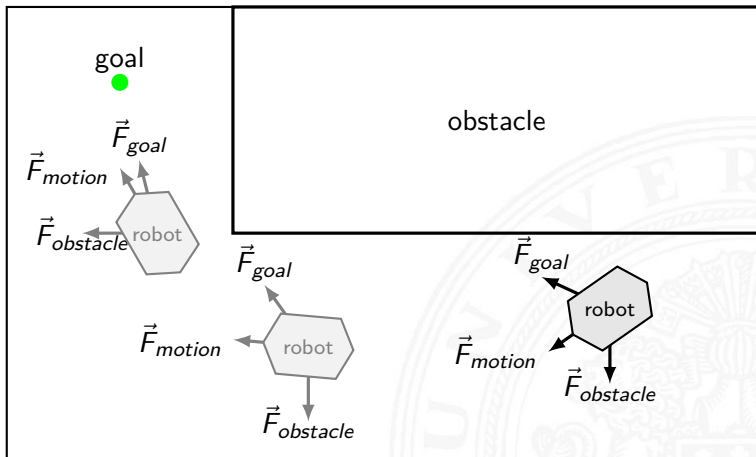
*The manipulator moves in a field of forces. The position to be reached is an attracting pole for the end effector and obstacles are repulsive surfaces for the manipulator parts.*

[13]



- ▶ Initially developed for real-time collision avoidance
- ▶ Potential field associates a scalar value to every point in space
- ▶ An ideal field used for navigation should
  - ▶ be smooth
  - ▶ have only one global minimum
  - ▶ the values should approach  $\infty$  near obstacles
- ▶ Force applied to the robot is the negative gradient of the potential field
- ▶ Robot moves along this force
- ▶ A function is defined in the free space, which has a global minimum at the goal configuration
- ▶ Motion follows steepest descend of the gradient

# Basic Principle (cont.)

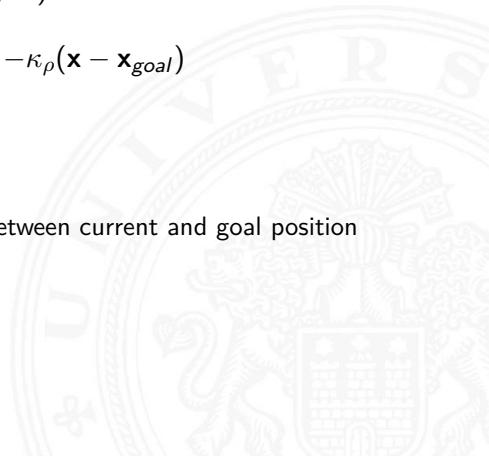




- ▶ The attracting force (of the goal)

$$\vec{F}_{goal}(\mathbf{x}) = -\kappa_{\rho}(\mathbf{x} - \mathbf{x}_{goal})$$

- ▶ where
  - $\kappa_{\rho}$  is a gain factor
  - $(\mathbf{x} - \mathbf{x}_{Goal})$  is the distance between current and goal position



- ▶ The potential field (of obstacles)

$$U(\mathbf{x}) = \begin{cases} \frac{1}{2}\eta\left(\frac{1}{\rho(\mathbf{x})} - \frac{1}{\rho_0}\right)^2 & \text{if } \rho(\mathbf{x}) \leq \rho_0 \\ 0 & \text{else} \end{cases}$$

- ▶ where
  - $\eta$  is a constant gain factor
  - $\rho(\mathbf{x})$  is the shortest distance to the obstacle  $O$
  - $\rho_0$  is a threshold defining the region of influence of an obstacle



- ▶ The repulsive force of an obstacle

$$\vec{F}_{obstacle}(\mathbf{x}) = \begin{cases} \eta \left( \frac{1}{\rho(\mathbf{x})} - \frac{1}{\rho_0} \right) \frac{1}{\rho(\mathbf{x})^2} \frac{d\rho(\mathbf{x})}{d\mathbf{x}} & \text{if } \rho(\mathbf{x}) \leq \rho_0 \\ 0 & \text{if } \rho(\mathbf{x}) > \rho_0 \end{cases}$$

- ▶ where  $\frac{d\rho(\mathbf{x})}{d\mathbf{x}}$  is the partial derivative vector of the distance from the point to the obstacle. This way, the direction of the force vector is expressed

[13]

# Advantages and Disadvantages of PFM

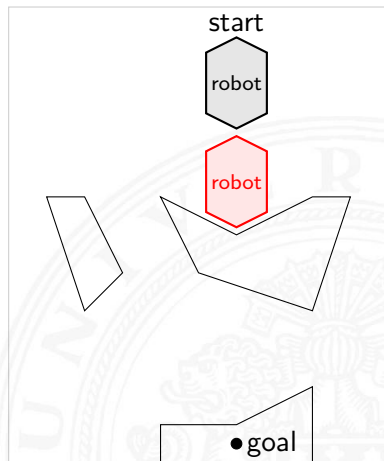
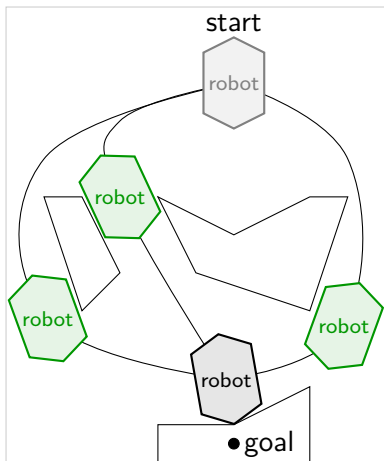
## Advantages:

- ▶ Usage of heuristics
- ▶ Real-time capable

## Disadvantages:

- ▶ Completeness
  - ▶ existing solution might not be found
  - ▶ calculation might not terminate if no solution exists
- ▶ Problem with multiple local minima may occur often
- ▶ No formal proof of capabilities
- ▶ No further constraints can be considered

# Local Minima of PFM





Demand for an efficient (i.e. fast, robust, easy to implement) framework to plan robot motion supporting high DOF.

Ideas:

1. Random samples in the region of interest
2. Test the samples for collisions
3. Connect samples using simple trajectories
4. Search in the resulting graph

## Motivation

Collision detection and distance estimation are faster than the generation of an explicit representation of free space.

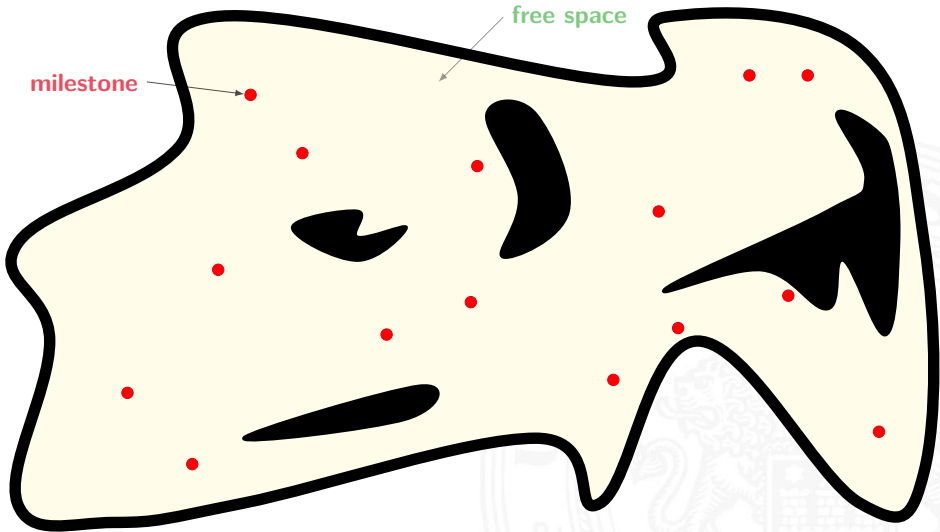
⇒ Probabilistic Roadmaps

[14]

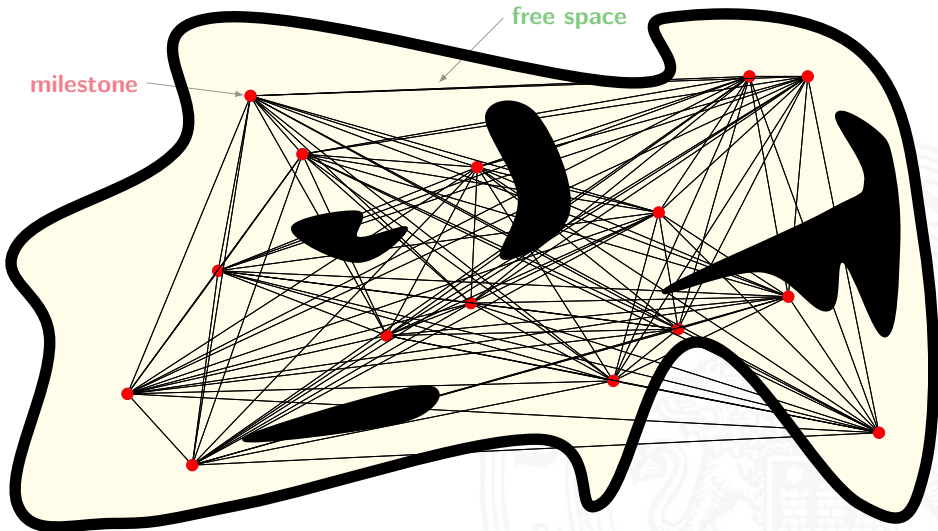
# Milestones and Roadmaps



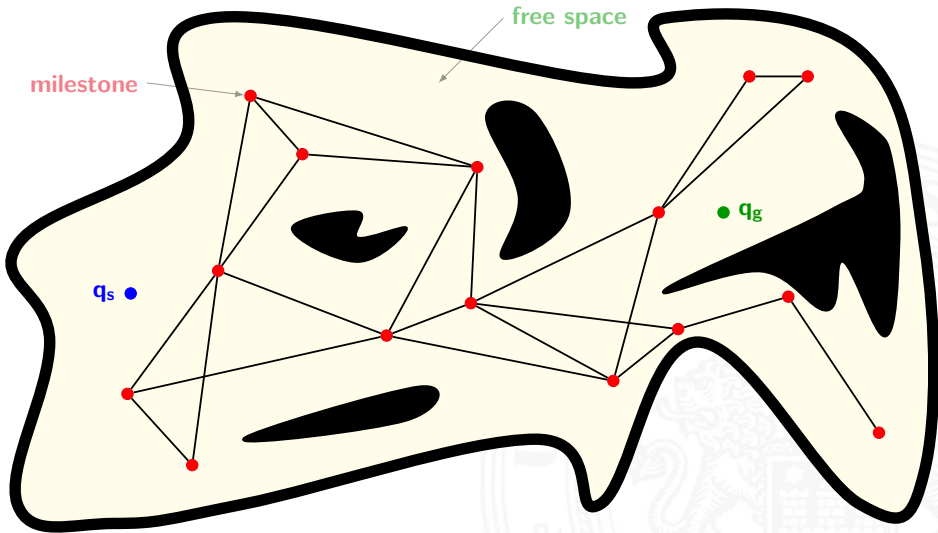
# Milestones and Roadmaps



# Milestones and Roadmaps

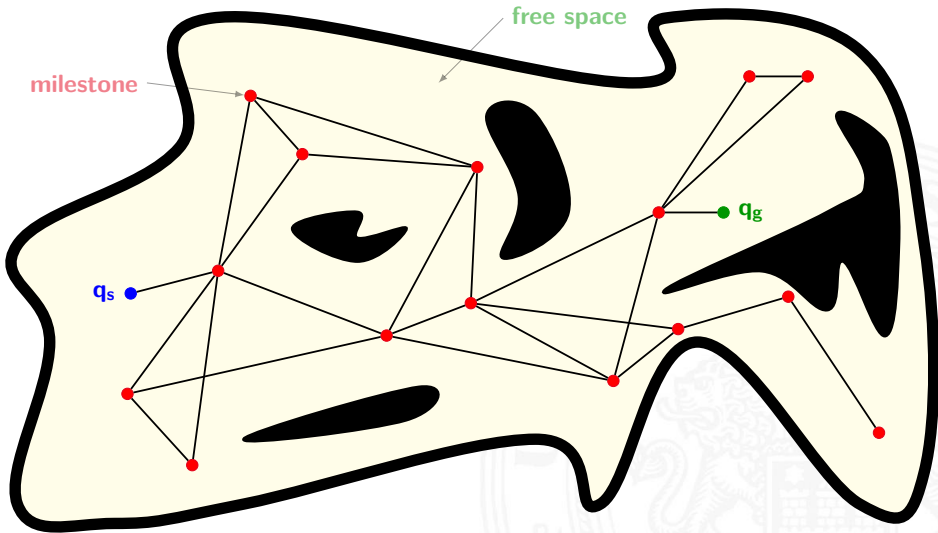


# Milestones and Roadmaps

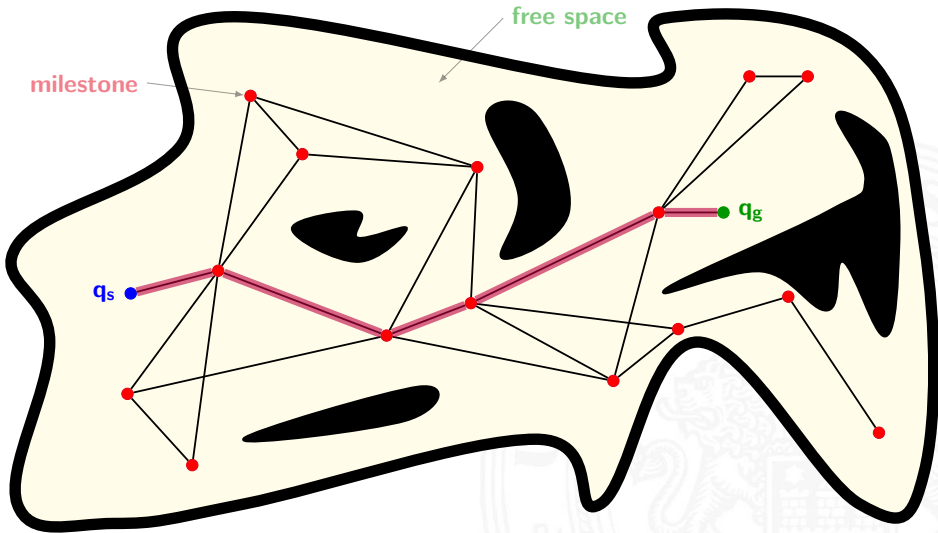




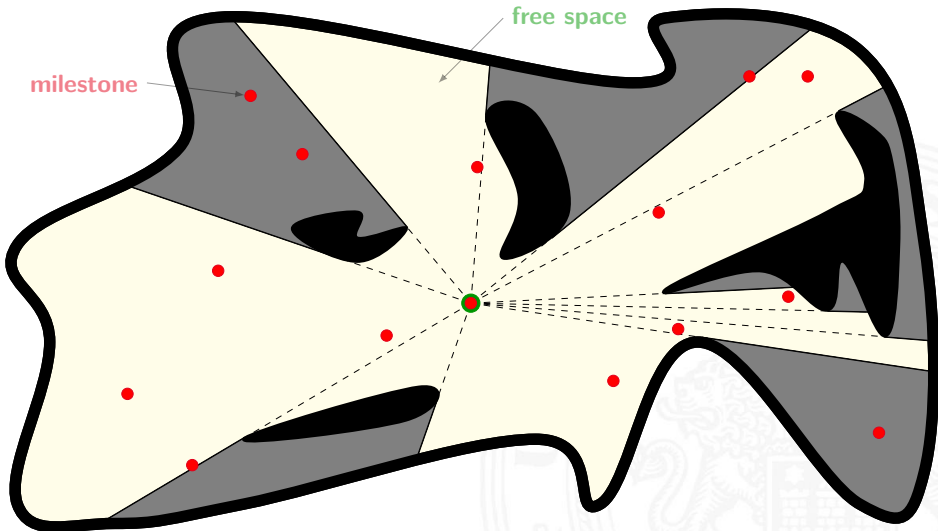
# Milestones and Roadmaps



# Milestones and Roadmaps



# Parallels to the Art-Gallery-Problem





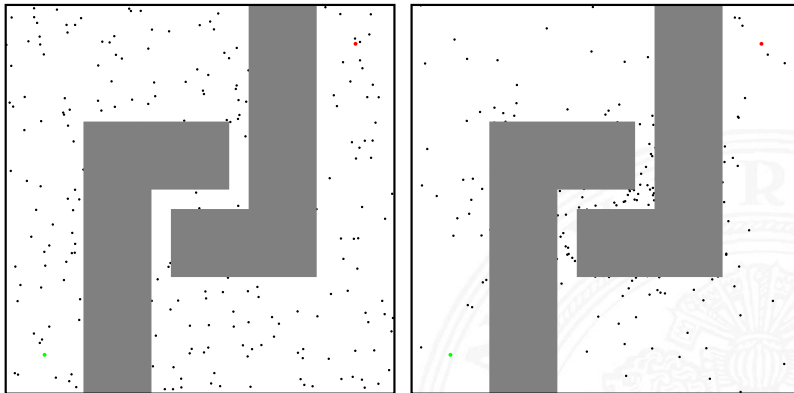
**Problem** 99% computation time of a probabilistic roadmap planner is used for collision checks.

**Solution** Intelligent strategy to reduce the size of the roadmap and thus the time for collision checks?

- ▶ Multi- vs single-exploration strategy
- ▶ Uniform
- ▶ Multi-level (coarse to fine)
- ▶ Obstacle-aware (shift colliding sample to free space)
- ▶ Lazy collision checks
- ▶ Probabilistic default values

[15]

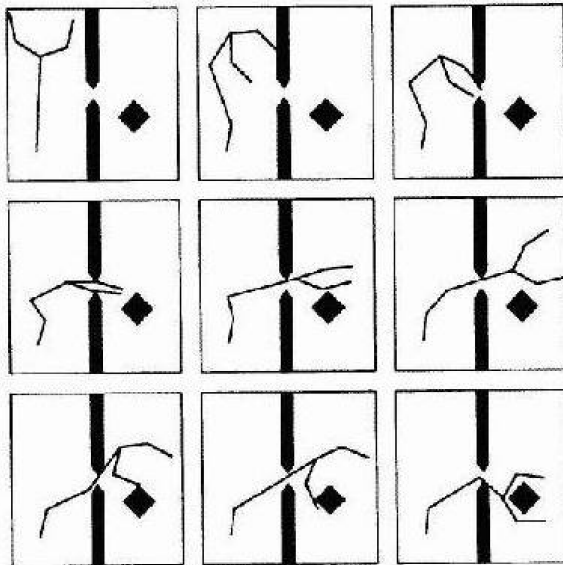
# Process of taking Samples



In an expansive free space:  $P_{fail} \sim e^{-N}$   
where  $N$ : the number of milestones



# Planning Results for a multi-joint artifact



## Disadvantages

- ▶ No strict termination criteria, if no solution can be found
  - ▶ only probabilistic completeness (an existing solution will eventually be found...)
- ▶ Missing insight to planning process

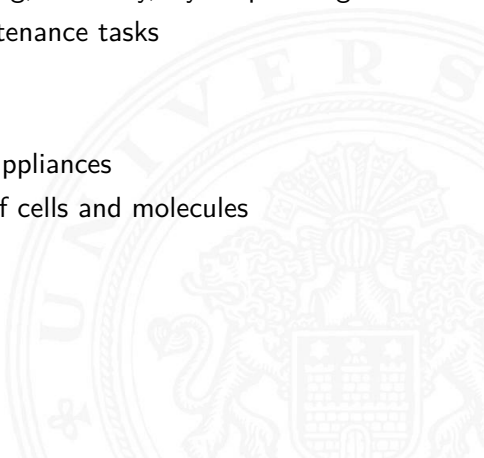
## Advantages

- ▶ Easy to implement
- ▶ Fast, scalable for problems with high DOF
- ▶ Rate of convergence increases with milestones

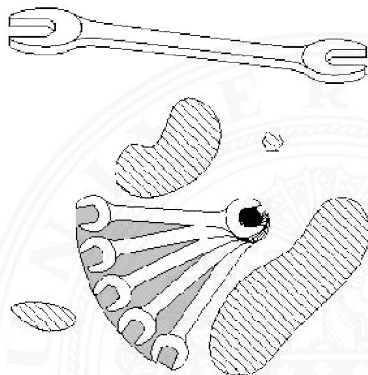
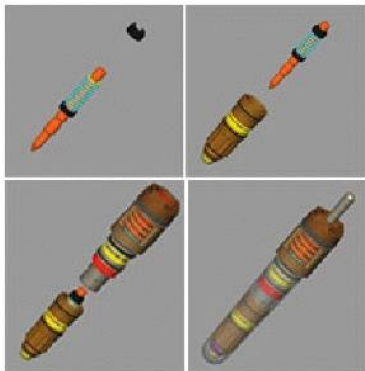




- ▶ Production: robot programming, assembly, layout planning
- ▶ Sequence generation for maintenance tasks
- ▶ Autonomous mobile robots
- ▶ Graphical animations
- ▶ Motion planning for medical appliances
- ▶ Simulation of realistic paths of cells and molecules
- ▶ ...

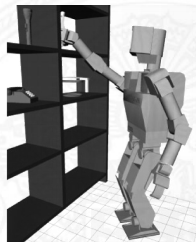
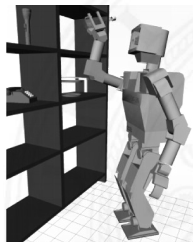
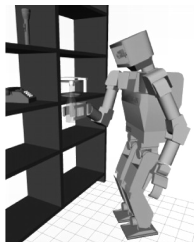
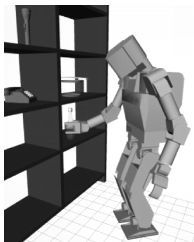
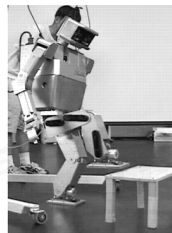
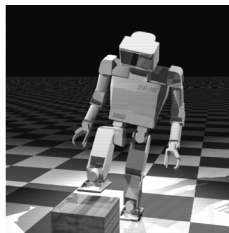
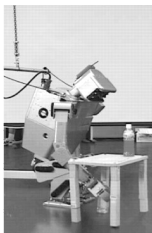
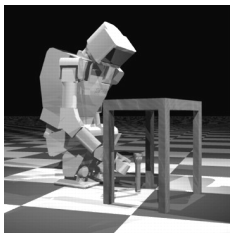


Using a path planner, the complexity of a product can be assessed.  
The assembly-process can be planned.



Path planning combined with optimization methods generate optimal positioning of robots and other equipment in a work cell.

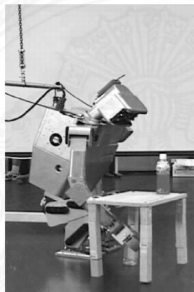
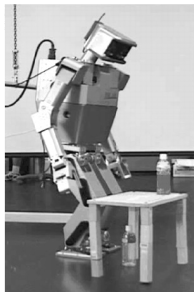
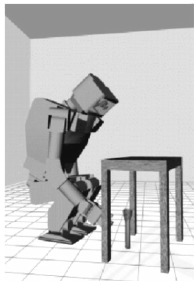
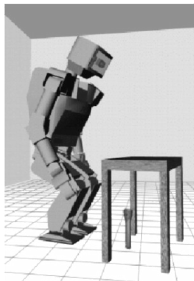
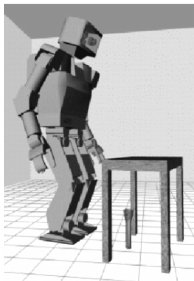




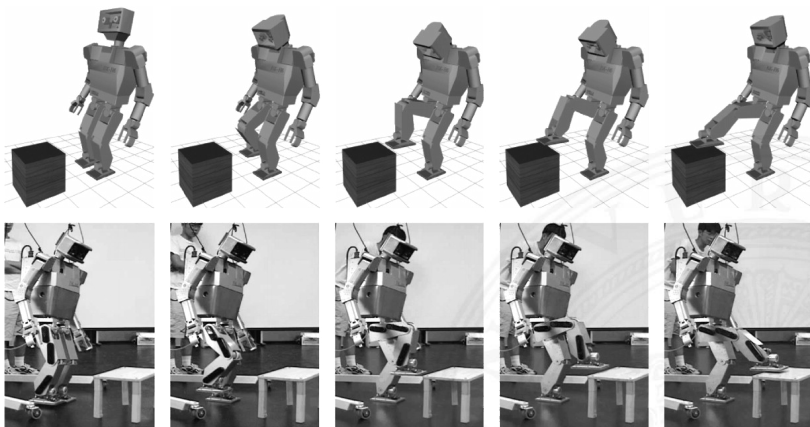
# Humanoid (cont.)

Task-level Programming and Path Planning - Application fields

Introduction to Robotics



# Humanoid (cont.)

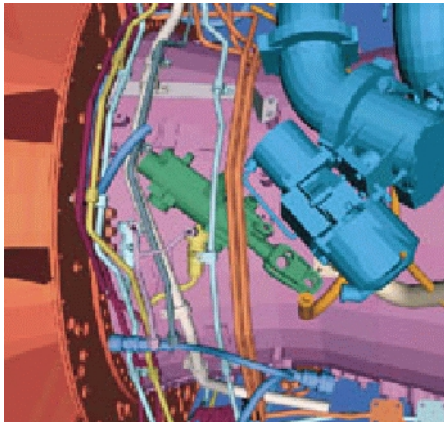


[16]

High DOF path planning is required for humanoid motion

Path planner can be used to automatically check the disassembly methods of parts.

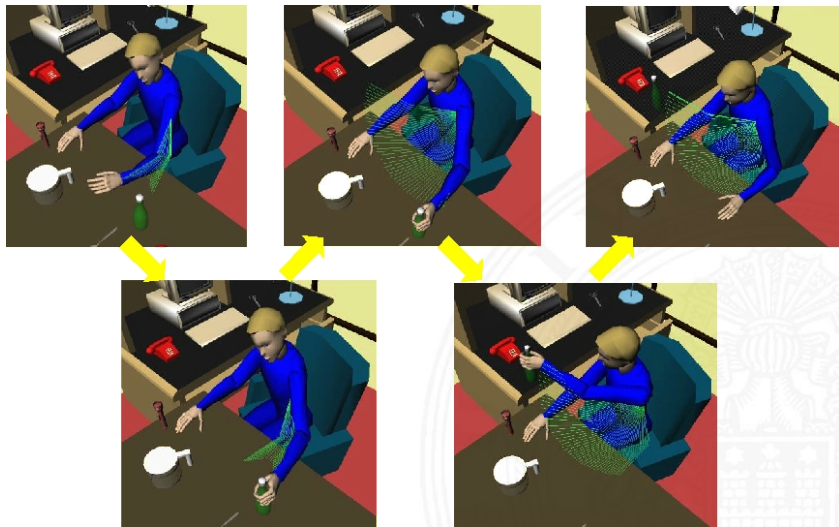
This way the products can be easier maintained and repaired.







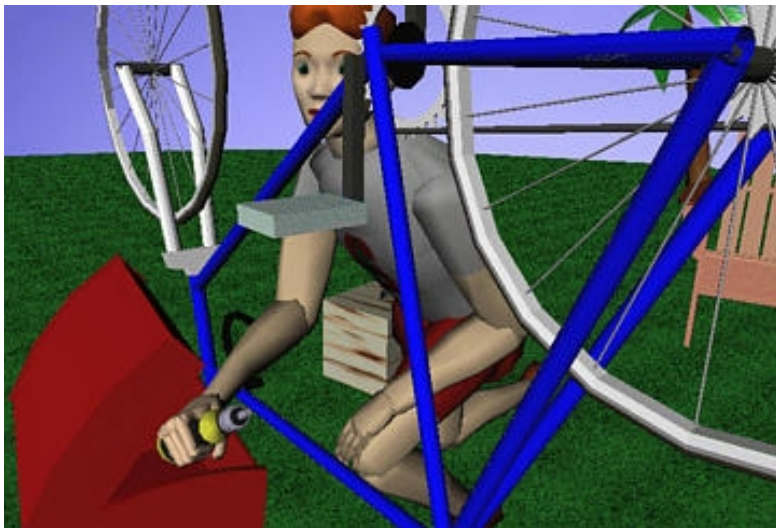
# Animation of Manipulation Scripts



# Animation as Simulation

Task-level Programming and Path Planning - Application fields

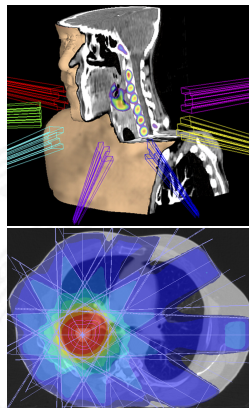
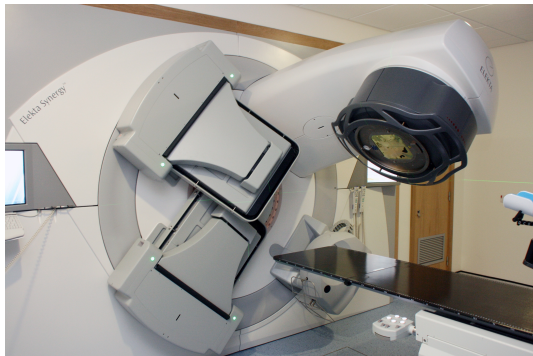
Introduction to Robotics



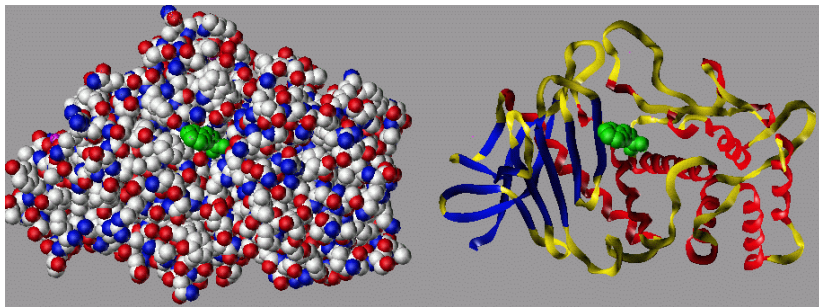
# Planning of Radiotherapy

Task-level Programming and Path Planning - Application fields

Introduction to Robotics



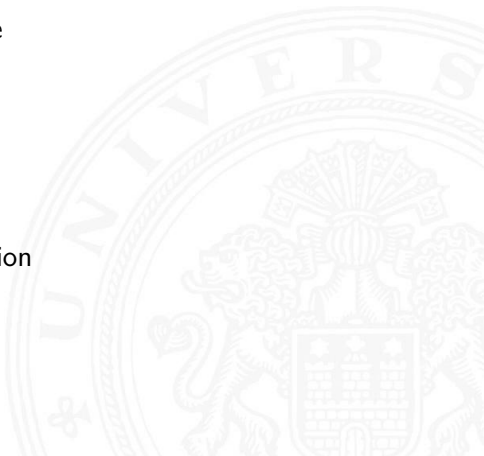
# Generation of Docking Motion of Molecules



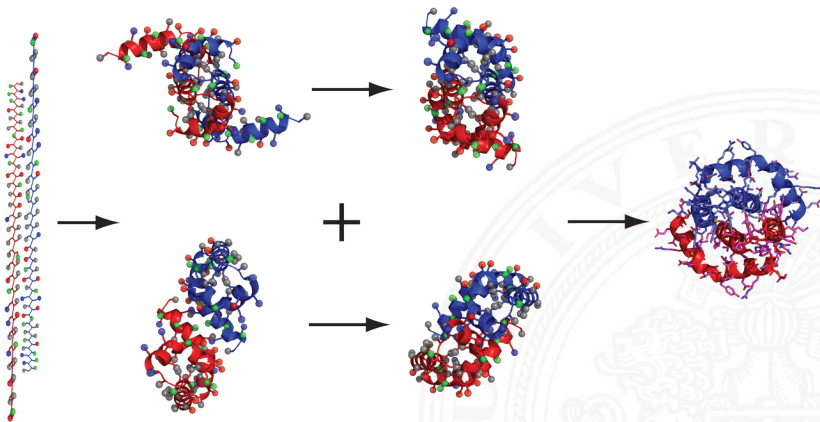


# Generation of Docking Motion of Molecules (cont.)

- ▶ moving obstacles
- ▶ multiple moving objects
- ▶ objects with deformable shape
- ▶ unspecified goals
- ▶ non holonomic constraints
- ▶ dynamic constraints
- ▶ planning for optimal time
- ▶ fuzzy sensing and plan execution
- ▶ highly complex artifacts

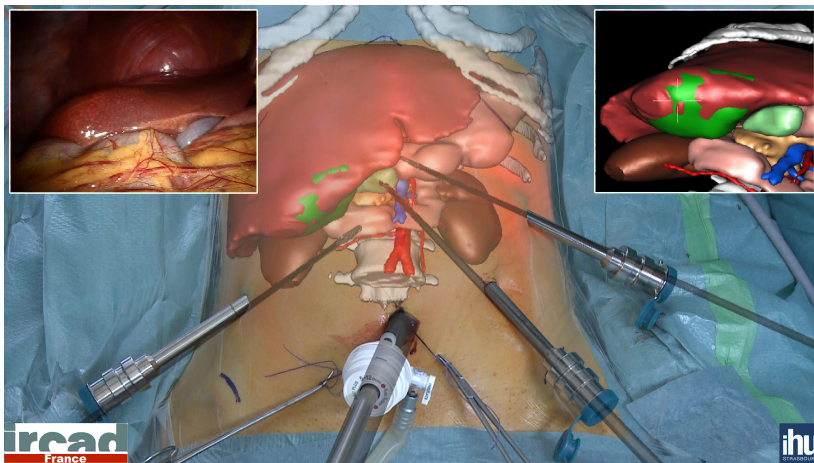


Handling of over 1000 degrees of freedom

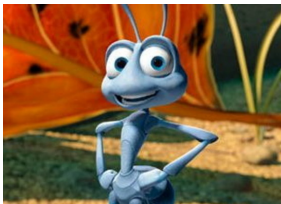


Skip next slide if sensible to blood and organs.

## Path planning for soft objects



# Autonomous Virtual Actors



A Bug's Life (1998, Disney/Pixar)



Antz (1998, DreamWorks/PDI)



Toy Story 3 (2010, Disney/Pixar)



Final Fantasy VIII (1999, Square)



Tomb Raider 5 (2000, Eidos Interactive)



The Legend of Zelda: Skyward Swords (2011, Nintendo)



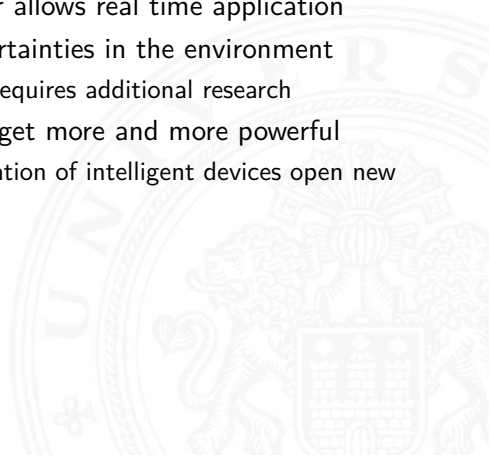


- ▶ Explicit representation of configuration space yields a complete solution
  - ▶ for sufficient resolution/precision
  - ▶ applicability is limited
- ▶ Distributed probabilistic approach for high DOF
- ▶ Path planning is native in the field of robotics
  - ▶ widely used in other fields
    - ▶ manufacturing, VR, animation, gaming, biology, chemistry, ...
- ▶ Simulated environments fulfill the requirements of geometrical path planning
  - ▶ known models of the environment
  - ▶ specified start and goal configurations
  - ▶ ideal execution



# Summary (cont.)

- ▶ Increasing computation power allows real time application
- ▶ Real robots face various uncertainties in the environment
  - ▶ Extension of basic problem requires additional research
- ▶ Embedded (robotic) systems get more and more powerful
  - ▶ motion modeling and calculation of intelligent devices open new fields of research

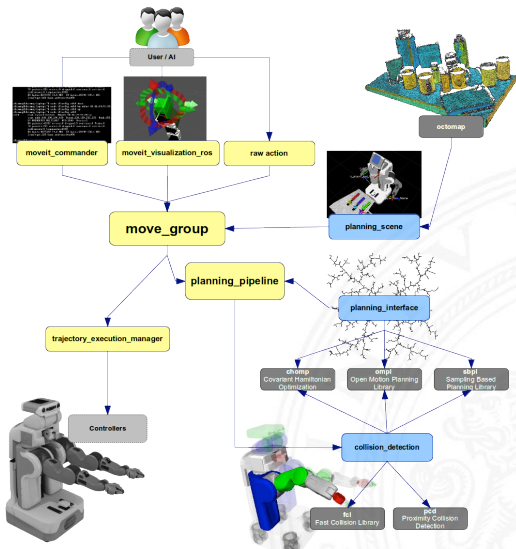




- ▶ Library of sampling based motion planning algorithms
- ▶ Integrated in ROS arm navigation stack (used on the PR2)
- ▶ Integrated in MoveIt! project
- ▶ Includes state-of-the-art motion planning algorithms
- ▶ No collision checking
- ▶ Demo videos at  
<http://ompl.kavrakilab.org/gallery.html>
- ▶ Tutorials on how to integrate OMPL at  
[http://wiki.ros.org/ompl\\_ros\\_interface/Tutorials](http://wiki.ros.org/ompl_ros_interface/Tutorials)

- ▶ Features
  - ▶ kinematics
  - ▶ dynamics
  - ▶ collision
  - ▶ checking
  - ▶ constraint evaluation
  - ▶ visualization
  - ▶ ...
- ▶ Planning and executing motion plans for different robots
- ▶ Overview at <http://moveit.ros.org>
- ▶ Tools
  - ▶ motion plan specification
  - ▶ configuration
  - ▶ debugging
  - ▶ visualization
  - ▶ benchmarking
  - ▶ ...

# Movelt! - A Planning Framework (cont.)



# Movelt! - A Planning Framework (cont.)

Task-level Programming and Path Planning - Practical Example: Path Planning with Movelt

Introduction to Robotics

The screenshot displays the Movelt! software interface, which is used for task-level programming and path planning. The interface is divided into several panels:

- Top Bar:** Contains various tool icons such as "Interact", "Move Camera", "Select", "Focus Camera", "Measure", "2D Pose Estimate", "2D Nav Goal", and "Publish Point".
- Displays Panel:** Shows the configuration for the "Planned Path" display. The trajectory topic is `/move_group/display_planned_path`. The "Show Robot Visual" and "Show Robot Collision" options are checked. Other settings include "Robot Alpha" (0,5), "State Display Time" (0,1 s), "Loop Animation" (unchecked), and "Show Trail" (unchecked). Buttons for "Add", "Remove", and "Rename" are also present.
- Motion Planning Panel:** Features tabs for "Context", "Planning", "Scene Objects", "Stored Scenes", and "Stored States". It is divided into three sections:
  - Commands:** Includes "Plan", "Execute", and "Terminal" buttons.
  - Query:** Allows selecting a "Start State" (currently "home\_pose") and a "Goal State". An "Update" button is available.
  - Options:** Includes a "Planning Time (s)" dropdown set to 3,00. There are checkboxes for "Allow Replanning" and "Allow Sensor Positioning", both of which are currently unchecked. "Path Constraints" is set to "None", and "Goal Tolerance" is set to 0,00.
- Workspace Panel:** Provides input fields for the robot's "Center (XYZ)" (0,00, 0,00, 0,00) and "Size (XYZ)" (2,00, 2,00, 2,00).
- Time Panel:** Displays performance metrics: "ROS Time: 1372422685.15", "ROS Elapsed: 7586.12", "Wall Time: 1372422685.20", and "Wall Elapsed: 7586.08". There is also an "Experimental" checkbox and a "Reset" button.
- 3D Visualization:** On the right side, a 3D view shows a robot model (a white cube on a blue base with yellow lights) in a grid environment. A blue path is visible, leading to a green rectangular goal. A red circular sensor field is also shown around the robot.



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MIN Faculty  
Department of Informatics



# Introduction to Robotics

## Lecture 13

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University of Hamburg  
Faculty of Mathematics, Informatics and Natural Sciences  
Department of Informatics

Technical Aspects of Multimodal Systems

July 12, 2018



Introduction

Coordinate systems

Kinematic Equations

Robot Description

Inverse Kinematics for Manipulators

Differential motion with homogeneous transformations

Jacobian

Trajectory planning

Trajectory generation

Dynamics

Principles of Walking

Robot Control

Task-Level Programming and Trajectory Generation







# Outline (cont.)

Task-level Programming and Path Planning

Task-level Programming and Path Planning

Architectures of Sensor-based Intelligent Systems

- The CMAC-Model

- The Subsumption-Architecture

- Control Architecture of a Fish

- Procedural Reasoning System

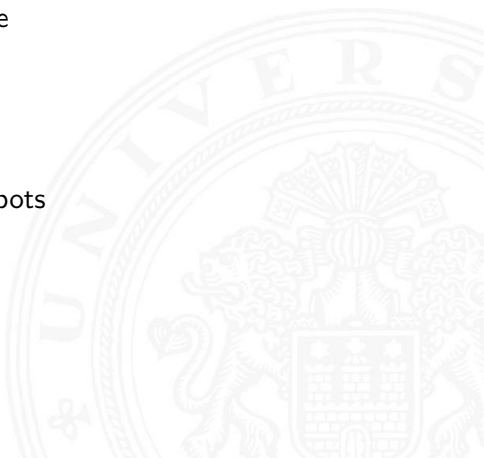
- Behavior Fusion

- Hierarchy

- Architectures for Learning Robots

Summary

Conclusion and Outlook

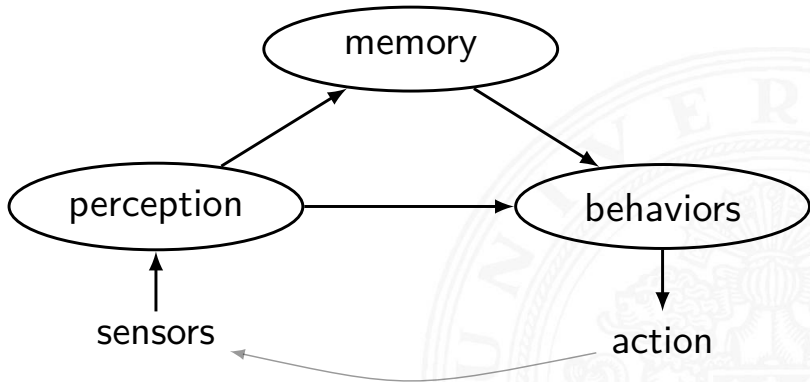




## Overview

- ▶ Basic behavior
- ▶ Behavior fusion
- ▶ Subsumption
- ▶ Hierarchical architectures
- ▶ Interactive architectures

# The Perception-Action-Model with Memory





## CMAC: Cerebellar Model Articulation Controller

**S** sensory input vectors (firing cell patterns)

**A** association vector (cell pattern combination)

**P** response output vector ( $\mathbf{A} \cdot \mathbf{W}$ )

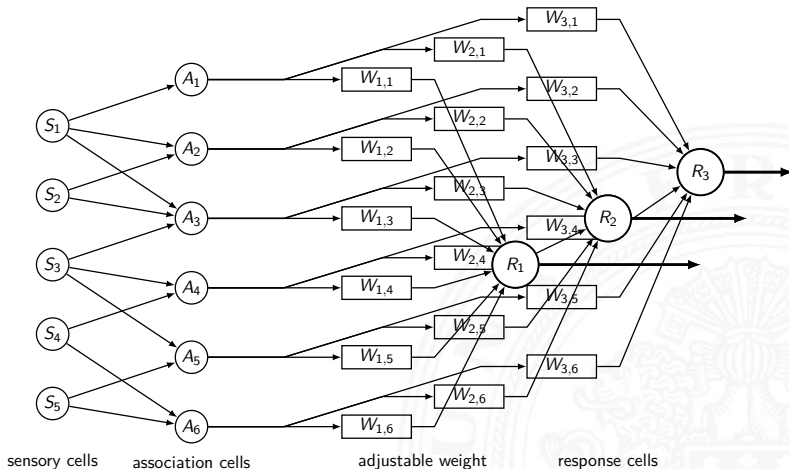
**W** weight matrix

The CMAC model can be viewed as two mappings:

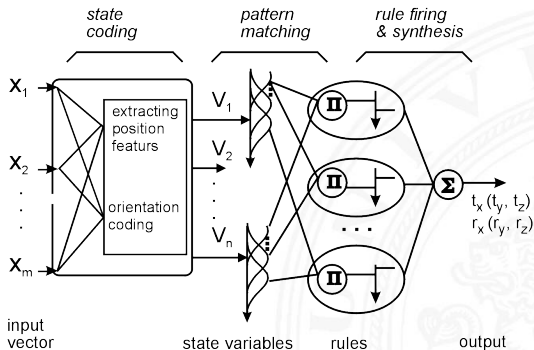
$$f : \mathbf{S} \longrightarrow \mathbf{A}$$

$$g : \mathbf{A} \xrightarrow{\mathbf{W}} \mathbf{P}$$

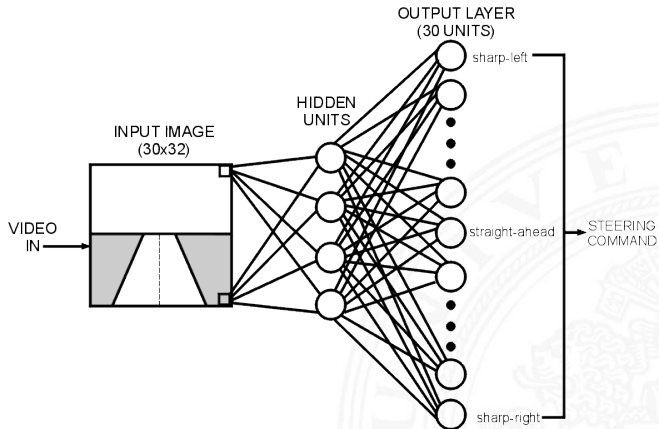
# CMAC-Model (cont.)



The B-Spline model is an ideal implementation of the CMAC-Model. The CMAC model provides an neurophysiological interpretation of the B-Spline model.

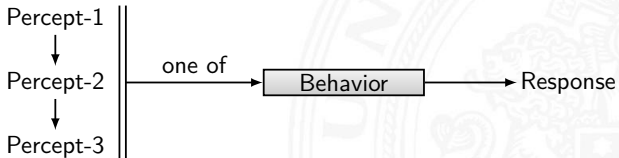
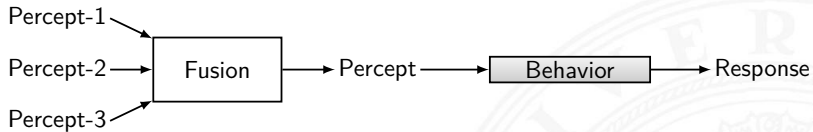
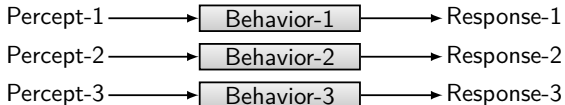


# Alvinn – Visual Navigation



CMU – Carnegie Mellon University

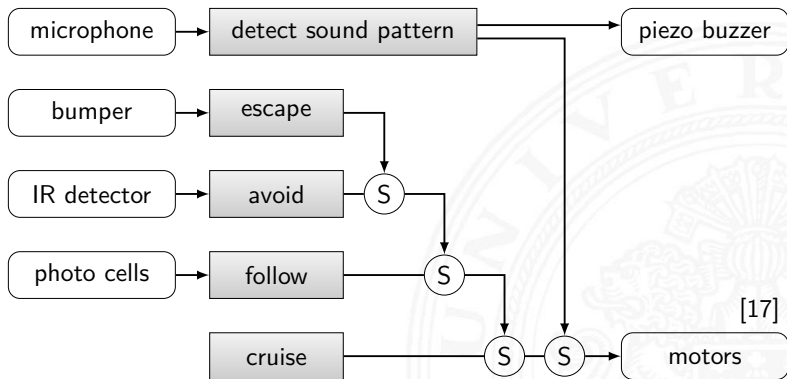
# Action-oriented Perception





# The Subsumption Architecture

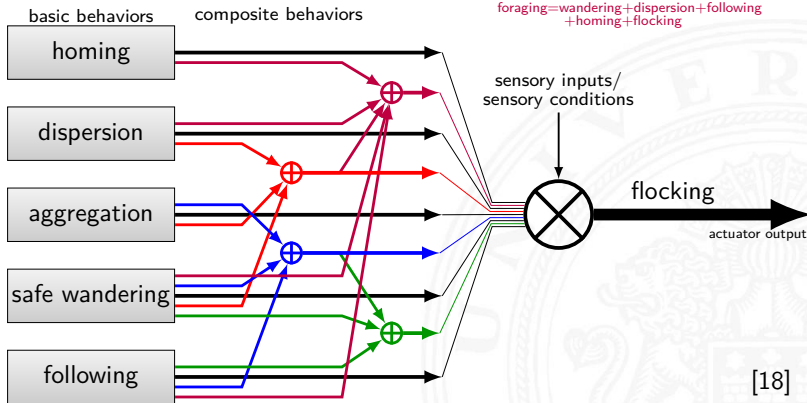
- ▶ hierarchical structure of behavior
- ▶ higher level behaviors subsume lower level behaviors



# Foraging and Flocking

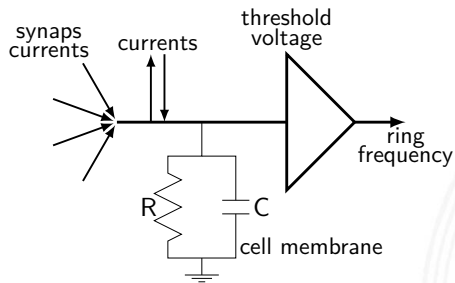
- ▶ multi-robot architecture
- ▶ basic behaviors are sequentially executed

flocking = wandering + aggregation + dispersion  
surrounding = wandering + following + aggregation  
herding = wandering + surrounding + flocking  
foraging = wandering + dispersion + following  
+ homing + flocking



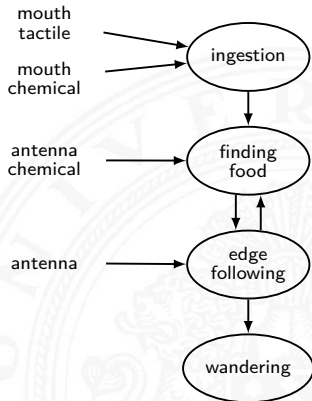
[18]

# Cockroach Neuron / Behaviors



SENSORS

BEHAVIORS





## Control and information flow in artificial fish

**Perception** sensors, focuser, filter

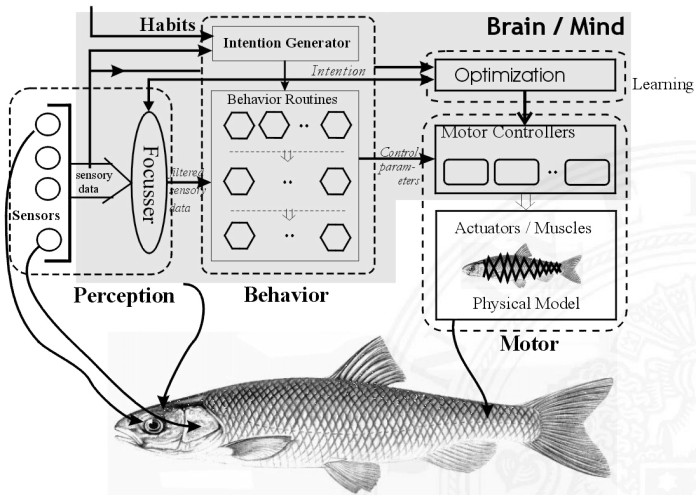
**Behaviors** behavior routines

**Brain/mind** habits, intention generator

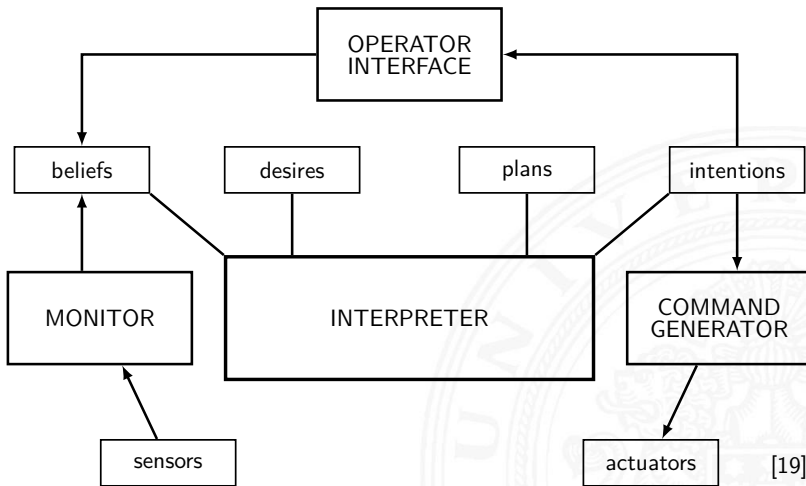
**Learning** optimization

**Motor** motor controllers, actuators/muscles

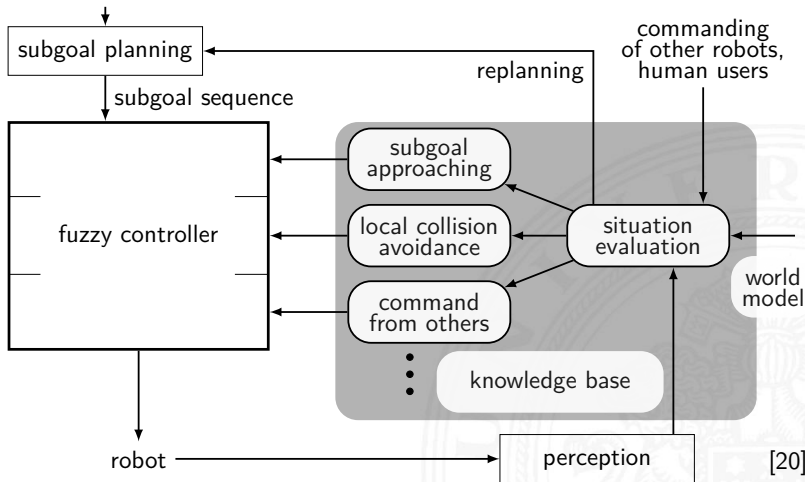
# Control Architecture of a Fish (cont.)



# Procedural Reasoning System



# Hierarchical Fuzzy-Control of a Robot



Fuzzy rules evaluate current situation.

**Situation evaluation** determines 3 fuzzy-parameters

- ▶ the priority  $K$  of the LCA rule base
- ▶ the replanning selector
- ▶ `NextSubgoal` (whether a subgoal has been reached)

**Typical rule** IF ( $SL_{85}$  IS HIGH) AND ( $SL_{45}$  IS VL) AND ( $SL_{R0}$  IS VL) AND ( $SR_{45}$  IS VL) AND ( $SR_{85}$  IS VL) THEN ( $Speed$  IS LOW) AND ( $Steer$  IS PM)  $K$  IS HIGH AND  $Replan$  IS LOW

**Translation** If the leftmost proximity sensor detects an obstacle which is near and the other sensors detect no obstacle at all, then steer halfway to the right at low speed. Mainly perform obstacle avoidance. No re-planning required.

**Coordination** of multiple rule bases

$$Speed = Speed_{LCA} \cdot K + Speed_{SA} \cdot (1 - K)$$

$$Steer = Steer_{LCA} \cdot K + Steer_{SA} \cdot (1 - K)$$

LCA: Local Collision Avoidance

SA: Subgoal Approach





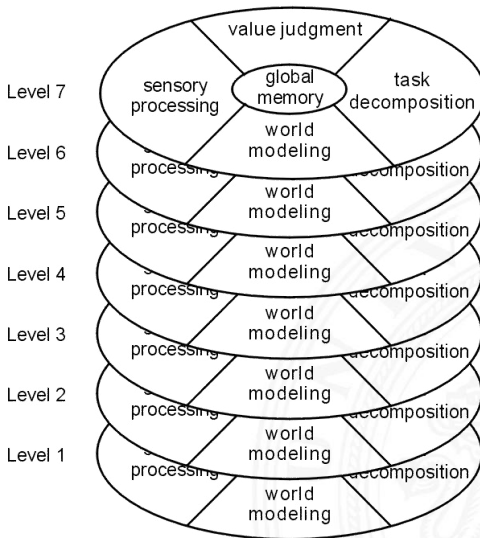
## Real-Time Control System (RCS)

- ▶ RCS reference model is an architecture for intelligent systems.
- ▶ Processing modes are organized such that the BG (Behavior Generation) modules form a command tree.
- ▶ Information in the knowledge database is shared between WM (World Model) modules in nodes within the same subtree.

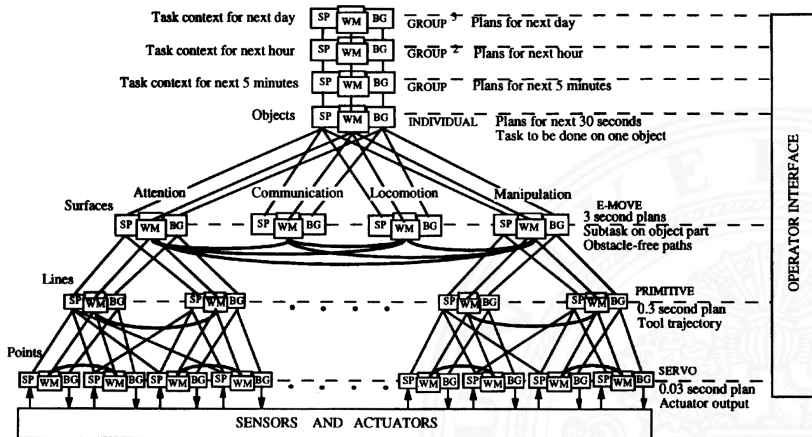
[21]

Examples of functional characteristics of the BG and WM modules:

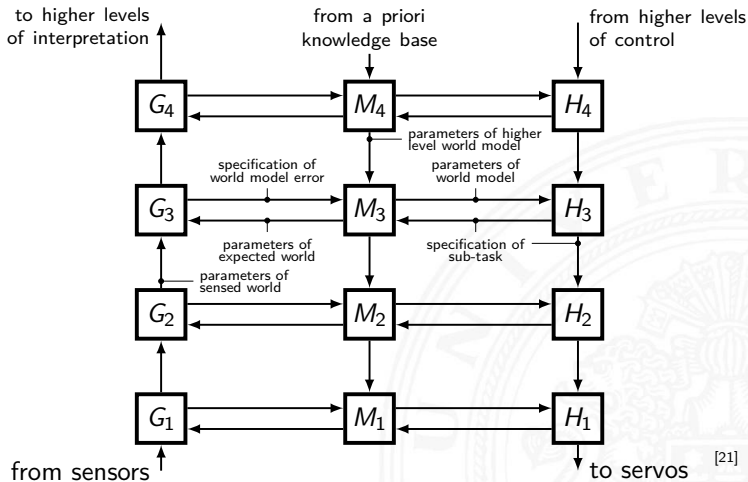
# Hierarchy (cont.)

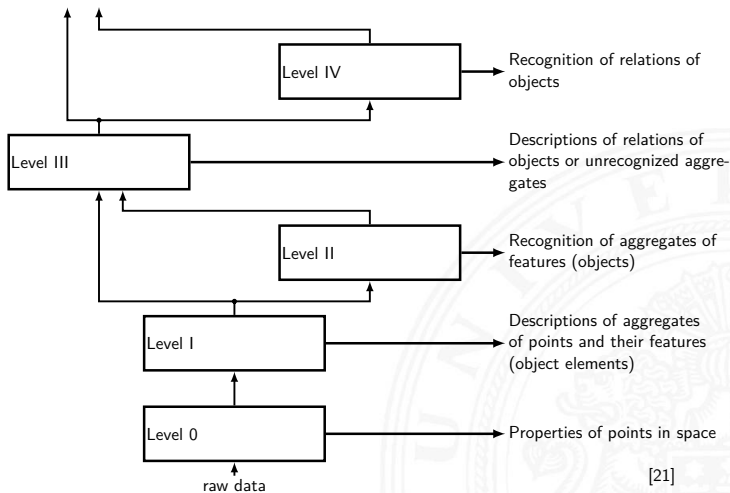


# Hierarchy (cont.)

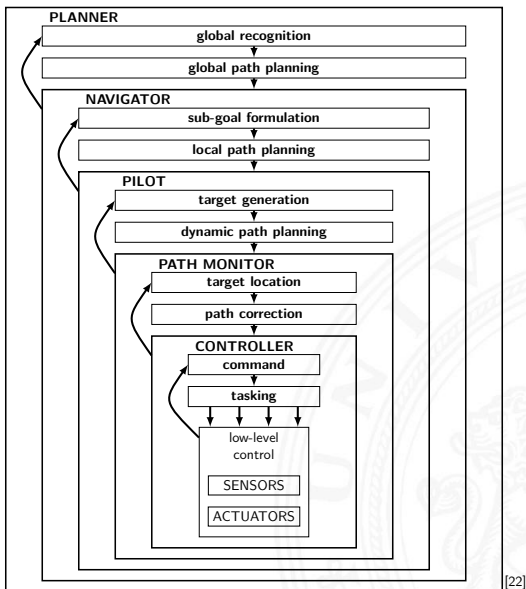


# Hierarchy (cont.)

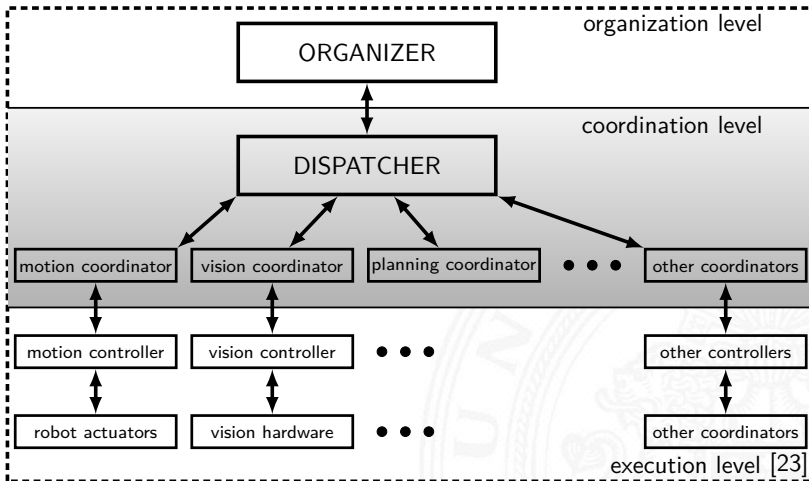




# Other examples



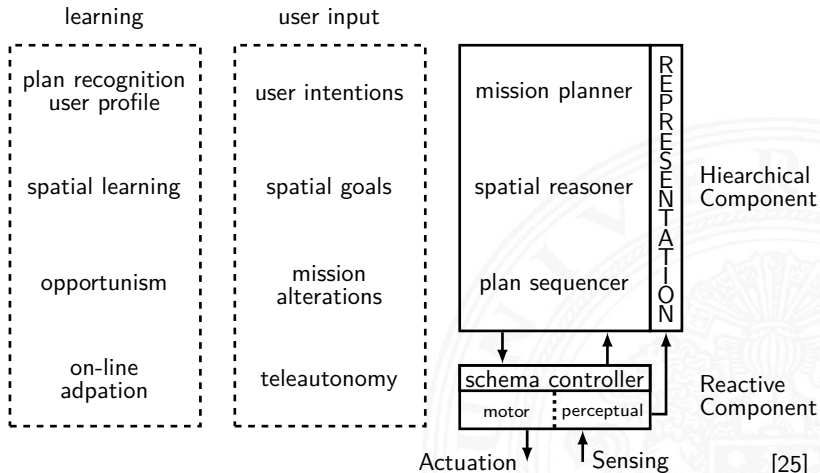
# Other examples



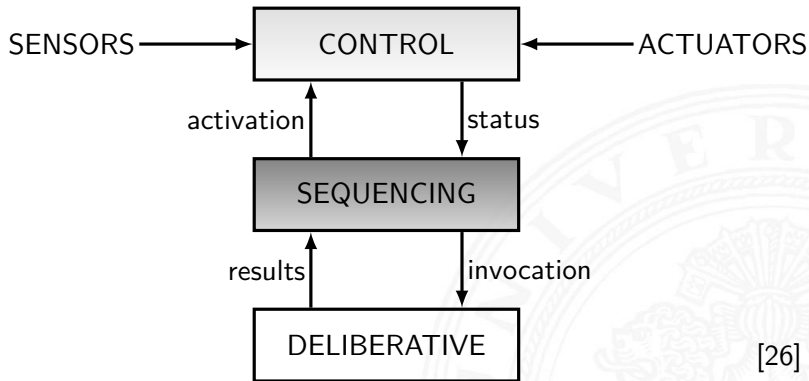




# AuRA Architecture

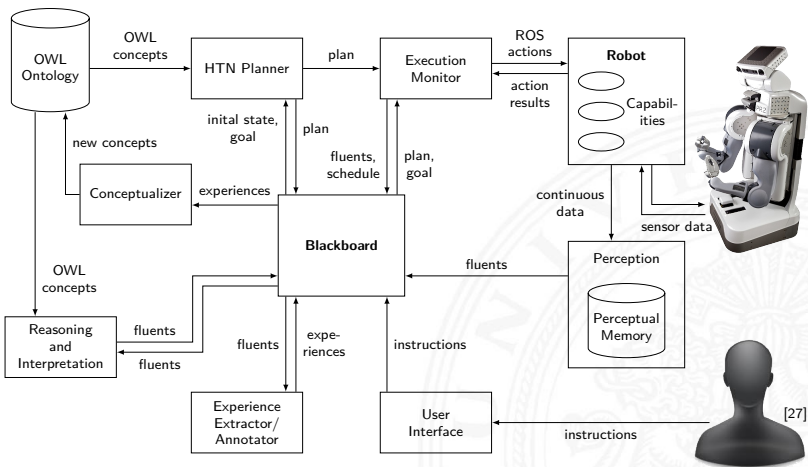


[25]



# RACE

## Robustness by Autonomous Competence Enhancement





Universität Hamburg

DER FORSCHUNG | DER LEHRE | DER BILDUNG

MIN Faculty  
Department of Informatics



# Introduction to Robotics

## Summary

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University of Hamburg  
Faculty of Mathematics, Informatics and Natural Sciences  
Department of Informatics

**Technical Aspects of Multimodal Systems**

July 12, 2018

Introduction

Coordinate systems

Kinematic Equations

Robot Description

Inverse Kinematics for Manipulators

Differential motion with homogeneous transformations

Jacobian

Trajectory planning

Trajectory generation

Dynamics

Principles of Walking

Robot Control

Task-Level Programming and Trajectory Generation



# Outline (cont.)

Summary

Introduction to Robotics

Task-level Programming and Path Planning

Task-level Programming and Path Planning

Architectures of Sensor-based Intelligent Systems

Summary

Conclusion and Outlook



- ▶ Industrial Robots:
  - ▶ position control with PID controllers
  - ▶ featuring gravity compensation
- ▶ Research:
  - ▶ model-based control
  - ▶ hybrid force-position control
  - ▶ under-actuated control
  - ▶ backwards controllable (direct drive, artificial muscle) structure
  - ▶ external-sensor based control
    - Intelligent Robots/Applied Sensor Technology

## Things we talked about

- ▶ Open chain of rotational joints
- ▶ Hybrid joints for rotational and translational motion (SCARA, Stanford)
- ▶ Mobile robots, running machines

## Things we did not talk about

- ▶ Closed chain, including Steward Mechanism [28, p. 279]
- ▶ Drive without motors



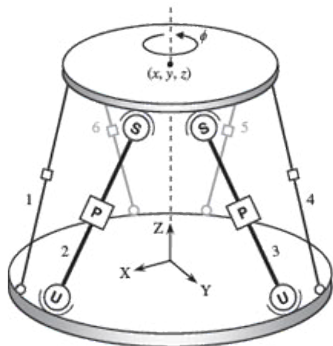


- ▶ Tool plate mounted to base plate with six translational joints (usually hydraulic) called 1eg
- ▶ Legs are connected to the plates with universal joints
- ▶ Mathematically 6-DOF configuration space without singularities
- ▶ Parallel mechanism provides high payload
  - ▶ Sequential manipulator applies forces and torques unequally

# The Stewart-Platform (cont.)

Summary

Introduction to Robotics



- ▶ Transformations
- ▶ Trajectory generation (e.g. linear Cartesian trajectory)
- ▶ Approximated representation of robot joints and objects
- ▶ Graph generation (V-Graph, T-Graph, ...)
- ▶ Search algorithms
- ▶ Further path planning algorithms
- ▶ Sensor fusion
- ▶ Vision
  - ▶ detection (static, dynamic)
  - ▶ reconstruction of position and orientation
- ▶ Action planning
- ▶ Sensor guided motion

## Introduction

- + Definition;
- Classification;
- + Basic components;
- + DOF

## Coordinate Transformation

- + Manipulator-coordinates (Robot&Table);
- + Homogeneous transformations;
- + Rotation matrices, their inverse and their operations;
- + Transformation equations [2, 28, 3, 1]

## Robot Description

- + DH-conventions and their applications (classic or modified);
- o Universal Robot Description Format (URDF)

## Kinematics

- + Problems of forward and inverse kinematics;
- Algebraic and geometric solution of inverse kinematics;
- + Differential homogeneous transformations;
- + Jacobi-matrices;
- + Singularities [2, 28, 3, 1]

## Trajectory Generation

- + Tasks and constraints;
- Polynomial solutions between two and four points;
- Factors of an optimal motion;
- + Linear motion in cartesian space, realization and problems;
- + Concepts of B-Spline interpolation;
- B-Spline basis functions [28, 3, 1, B-Spline Literature]

## Programming

- Task description, steps from the definition of frames to the implementation of programs;
- Advantages and concepts of RCCL [2, RCCL-Guide];
- Types of robot programming;
- offline-programming [28, 3]

## Control

- Control systems of a PUMA robot;
- Linear and model-based control;
- PID controller;
- + Control concepts in Cartesian space [28, 3, 1]

## Sensors

- Classification;
- + Intrinsic sensors, principle and application in control;
- extrinsic sensors [28, 3, 1]

## Dynamics

- + Problems;
- + Newton-Euler equations and Lagrangian Equations;
  - Solution for arms with 1 or 2 joints, multiple joints as exercise;
- + Structure of a dynamical equation [28, 3, 1]

## Collision avoidance

- + Configuration space;
- + Concepts of transformation to configuration space;
  - o Object representation;
- + Potential field method;
- + Probabilistic approaches

## Control architectures

- Subsumption;
- CMAC;
- Hierarchical

Additional references: [29, 30, 31, 32]





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# Outline (cont.)

Conclusion and Outlook

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Summary

Conclusion and Outlook





Underlying robot-technique as described, additionally:

## External Recognition

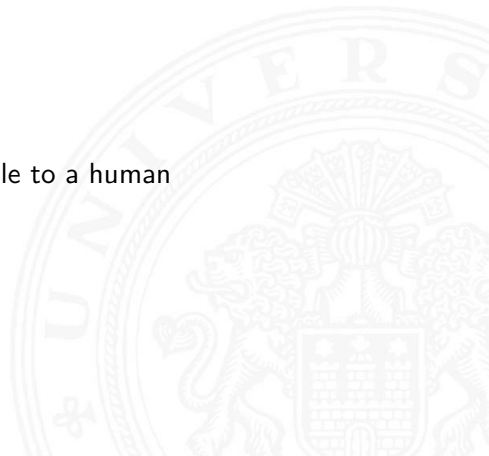
- Reliable measurements of the environment;
- Scene interpretation

## Knowledge base

- About environment;
- Its own state;
- Everyday knowledge comparable to a human

## Autonomous planning

- Action;
- Coarse motion;
- Grasping;
- Sensor data acquisition



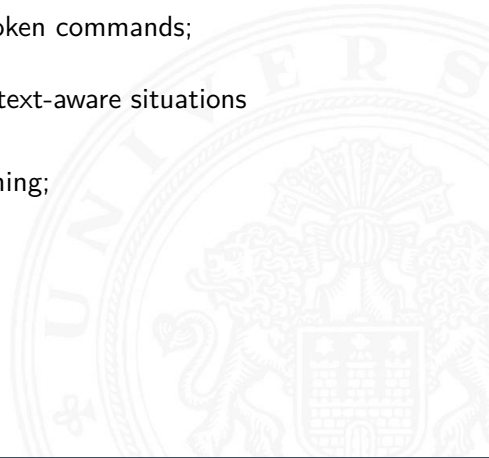


## Human friendly interface

- Understanding of naturally spoken commands;
- Generation of robot actions;
- Solving of disambiguity in context-aware situations

## Adaptive Control

- Evolution instead of programming;
- Ability to learn



## Action Planning

- Task-Specification;
- State representation;
- Task-decomposition;
- Action-sequence generation

## Motion Planning

- Representation of the robot and the environment;
- Calculation and representation of configuration space;
- Search algorithms

## Planning of Sensing

- Which sensors;
- Which time intervals;
- Where to measure;
- Internal and external parameters of the sensor



## Goal

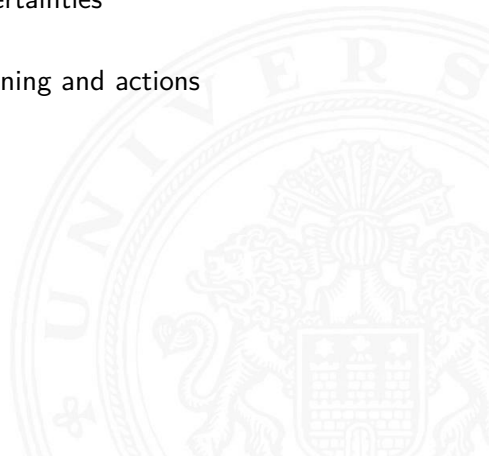
Intelligent Control including the ability to adapt to different situations and to react to uncertainties

## Control Architecture

Integration of perception, planning and actions

## Tasks of sensor data processing

- Position detection;
- Proximity detection;
- Slip detection;
- Success confirmation;
- Error detection;
- Inspection





## Applied sensors

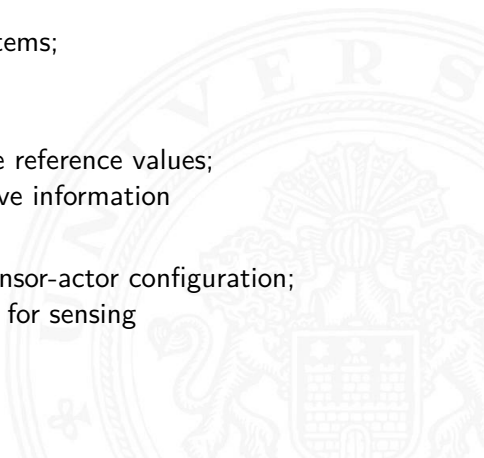
- Tactile sensors;
- Vision systems;
- Force-torque measurement systems;
- Distance sensors

## Strategies

- calibrated based on absolute reference values;
- uncalibrated based on relative information

## Types of perception

- passive based on a certain sensor-actor configuration;
- active depending on the plan for sensing





will be:

- ▶ dexterous
- ▶ smaller
- ▶ faster
- ▶ lightweight
- ▶ powerful
- ▶ intelligent
- ▶ easier to operate
- ▶ cheaper





## Methods

- Symbolical understanding of the environment;
- Integrated sensor-motor-coupling;
- Self-learning

## Systems

- Synergetic multi-sensor;
- Agile mobility;
- Dexterous manipulation capabilities

## Technical

- Sensor complexity similar to a human;
- New drive types;
- Nano-robots;
- Multifinger hand;
- Anthropomorphic robots;
- Flying robots

## Intelligent Robots Project

Build a complex robotic system from the available hardware at TAMS. Current Hardware includes PR2, TASER, 2 KUKA lightweight arms, 2 Mitsubishi PA10-6C, UR5 Arm, 4 Turtlebots, Shadow Hand C6, Shadow Hand C5, Robotiq adaptive gripper, SCHUNK gripper, 2 Barret Hands...

## Intelligent Robots/Applied Sensor Technology Lecture

Intrinsic and Extrinsic sensor technology and their application for intelligent robotic systems.

## Machine Learning Lecture

Machine learning techniques allow robots to learn from observation and experience

## Neural Networks Lecture

Neural Networks allow robots to learn and offer new approaches to planning and control

## Image Processing I&II Lecture

Image processing is required for robots to observe the environment and recognize/classify/detect objects and humans

## Knowledge Processing Lecture

The gained knowledge from observance and sensing has to be processed efficiently

## Language Processing Lecture

How to extract knowledge and information from human speech

## Real-Time Systems Lecture at TUHH

Robots have to process information and act in Real-Time environments

## Fundamentals of Control Technology Lecture at TUHH

Control Technology is required for the technical control of robotic systems. Advanced Lecture with large prerequisites.



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