



Introduction to Robotics

Lecture 3

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Technical Aspects of Multimodal Systems

April 23, 2021



Introduction

Spatial Description and Transformations

Forward Kinematics

Robot Description

- Recapitulation of DH-Parameter

- URDF

Inverse Kinematics for Manipulators

Instantaneous Kinematics

Trajectory Generation 1

Trajectory Generation 2

Dynamics

Robot Control

Path Planning

Task/Manipulation Planning





Outline (cont.)

Robot Description

Introduction to Robotics

Telerobotics

Architectures of Sensor-based Intelligent Systems

Summary

Conclusion and Outlook



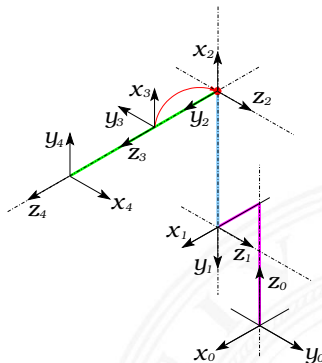
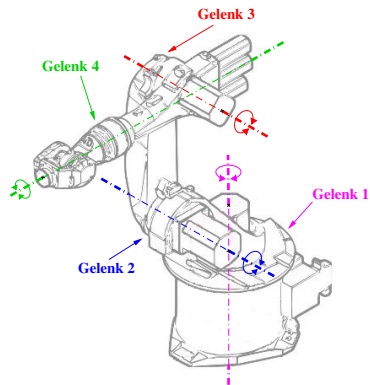


- ▶ universal minimal robot description
- ▶ based on frame transformations
- ▶ **four** parameters per frame transformation
- ▶ serial chain of transformations
- ▶ unique description of T_6

Drawbacks

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

Definition of joint coordinate systems



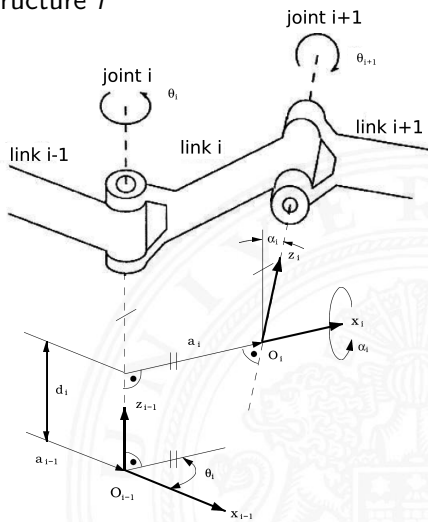
- ▶ CS_0 is the stationary origin at the base of the manipulator
- ▶ axis z_{i-1} is set along the axis of motion of the i^{th} joint
- ▶ axis x_i is the common normal of $z_{i-1} \times z_i$
- ▶ axis y_i concludes a right-handed coordinate system

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
- ▶ α_i : rotation angle around the x_i -axis, which aligns the z_{i-1} -axis to the z_i -axis

a_i and α_i are constant values due to construction



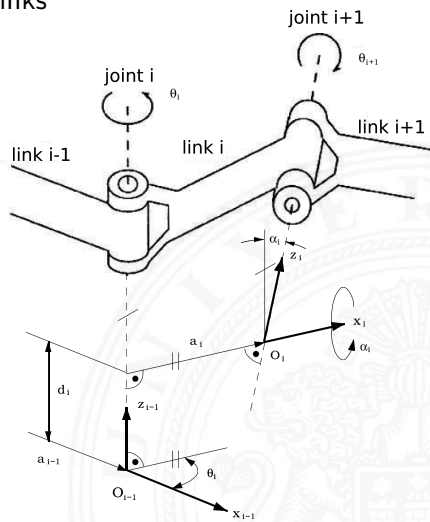
Parameters for description of two arbitrary links (cont.)

Two for relative distance and angle of adjacent links

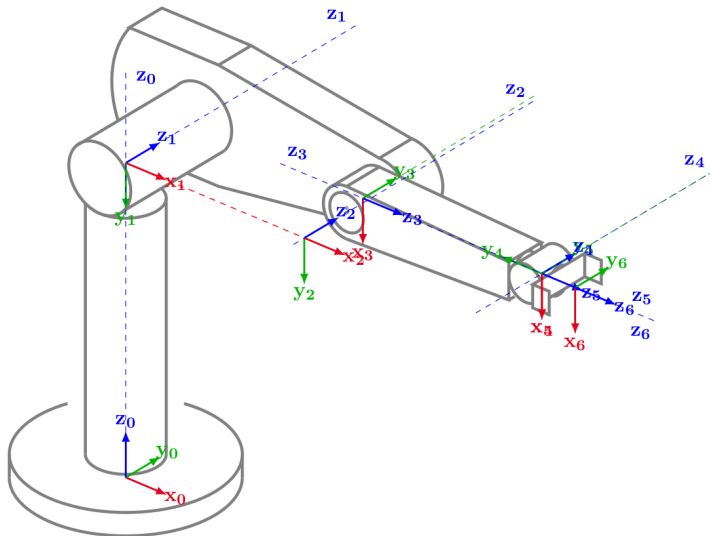
- ▶ d_i : distance origin O_{i-1} of the $(i-1)^{\text{st}}$ CS to intersection of z_{i-1} -axis with x_i -axis
- ▶ θ_i : joint angle around z_{i-1} -axis to align x_{i-1} - parallel to x_i -axis into x_{i-1}, y_{i-1} -plane

θ_i and d_i are variable

- ▶ rotational: θ_i variable, d_i fixed
- ▶ translational: d_i variable, θ_i fixed



Example featuring PUMA 560





DH parameters of PUMA 560

Joint	a_i	α_i	d_i	θ_i
1	0	$-\frac{\pi}{2}$	d_1	θ_1^*
2	a_2	0	0	θ_2^*
3	a_3	$\frac{\pi}{2}$	d_3	θ_3^*
4	0	$-\frac{\pi}{2}$	d_4	θ_4^*
5	0	$\frac{\pi}{2}$	0	θ_5^*
6	0	0	d_6	θ_6^*

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



Documentation

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

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

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

- ▶ robot description format used in ROS¹⁹
- ▶ hierarchical description of components
- ▶ XML format representing robot model
 - ▶ kinematics and dynamics
 - ▶ visual
 - ▶ collision
 - ▶ configuration

¹⁹<http://ros.org>

▶ 1st-level structure

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

▶ 2nd-level structure

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

▶ 3rd-level structure

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

▶ 4th-level structure

⋮



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

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

- ▶ XML element types

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

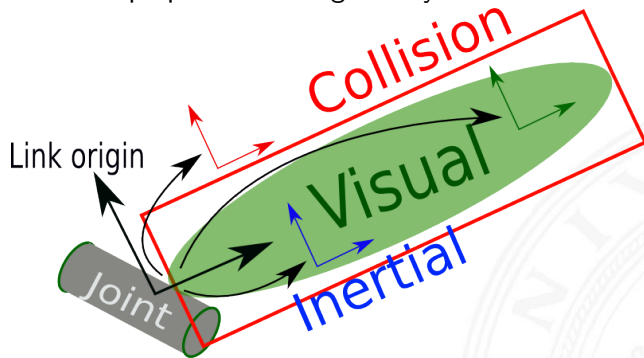
```
<tag attribute="value">  
text or element(s)  
</tag>
```

- ▶ XML comments

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



Link describes geometrical properties of a rigid body.



20



URDF: Link (cont.)

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

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

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

²⁰<http://wiki.ros.org/urdf/XML/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>
  <collision>
    <origin xyz="0 0 0.01" rpy="0 0 0"/>
    <geometry>
      <cylinder radius="1" length="0.5"/>
    </geometry>
  </collision>
</link>
```

- ▶ the `<collision>` element can be simpler from the `<visual>` in order to reduce computation time



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>



Inertia tensor describes the distribution of mass of the link

- ▶ orientation and position of the inertia CS described by `<origin>` tag

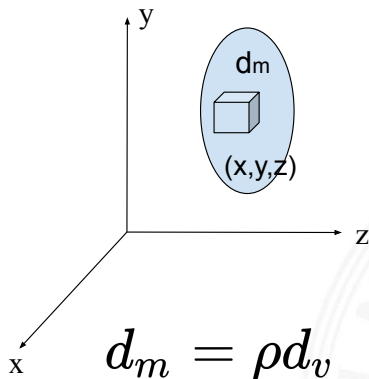


$$A_I = \begin{bmatrix} I_{xx} & -I_{xy} & -I_{xz} \\ -I_{xy} & I_{yy} & -I_{yz} \\ -I_{xz} & -I_{yz} & I_{zz} \end{bmatrix}$$

- ▶ diagonal values describe main inertial axes `ixx`, `iyy`, `izz`
- ▶ `ixy`, `ixz`, `iyz` are 0 for symmetric primitives
- ▶ rotations around largest and smallest inertial axis are most stable

- ▶ moments of inertia:

$$I_{xx} = \int (y^2 + z^2) dm \quad I_{yy} = \int (x^2 + z^2) dm \quad I_{zz} = \int (x^2 + y^2) dm$$

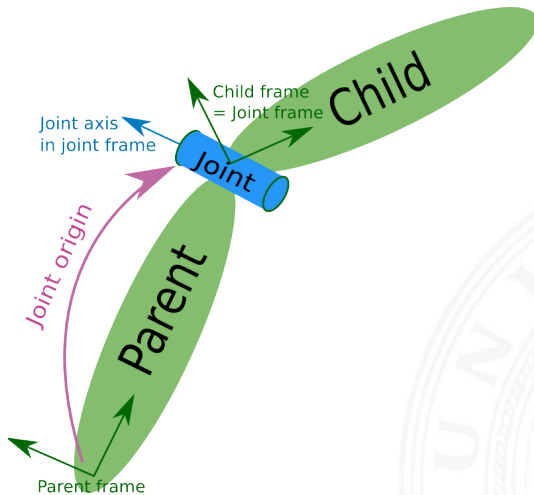


- ▶ Products of Inertia:

$$I_{xy} = I_{yx} = \int xy dm \quad I_{zy} = I_{yz} = \int yz dm \quad I_{xz} = I_{zx} = \int zy dm$$



Joint describes geometrical connections of two links.





```
<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>
```

²¹<http://wiki.ros.org/urdf/XML/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

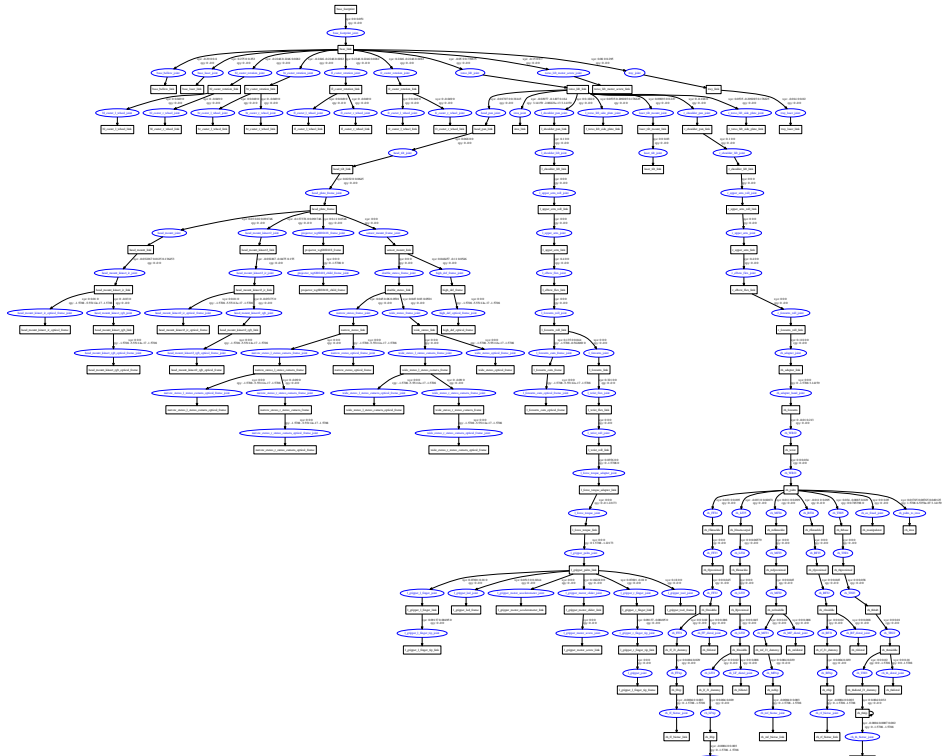
`safety_controller` `soft_lower_limit`, `soft_upper_limit`, `k_position`, `k_velocity`



- ▶ 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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- Workspace

- Algebraic solvability of manipulator

- Geometrical solvability of manipulator

- Popular inverse kinematics solutions

Instantaneous Kinematics

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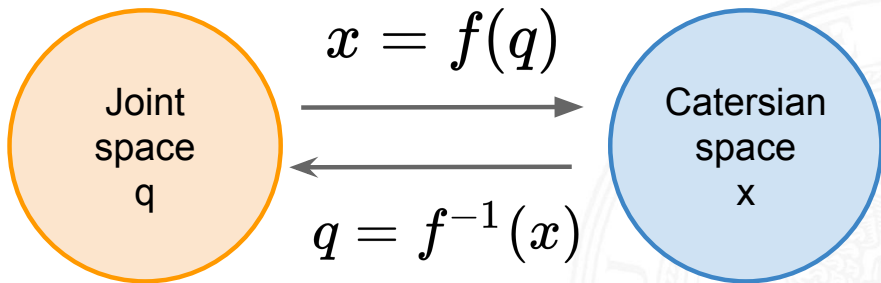
- ▶ **Forward Kinematics:** given robot configurations(joint angles), find position & orientations of the end-effector

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*.



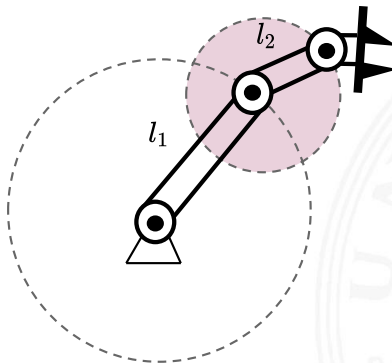
- ▶ **Inverse Kinematics:** give position & orientations of the end-effector, find robot configurations(joint angles)



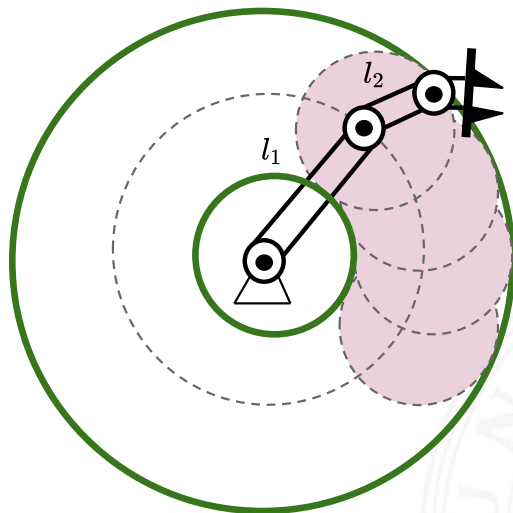
Existence of solutions: Workspace

Workspace: the volume of space that is reachable for the tool of the manipulator.

- ▶ reachable workspace
- ▶ dexterous workspace

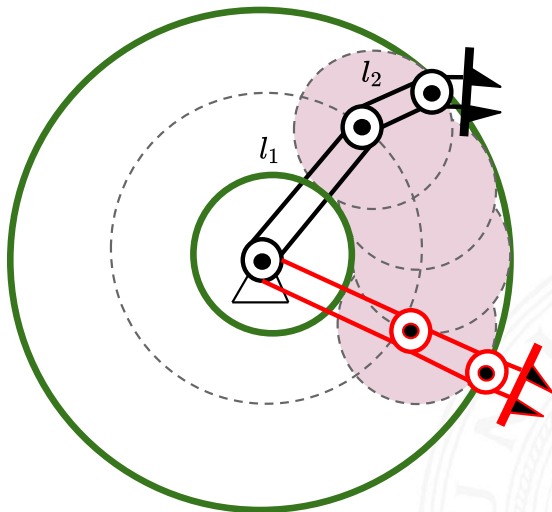


Existence of solutions: Workspace (cont.)



if $l_1 \neq l_2$, the reachable workspace becomes a ring of outer radius $|l_1 + l_2|$, and inner radius $|l_1 - l_2|$.

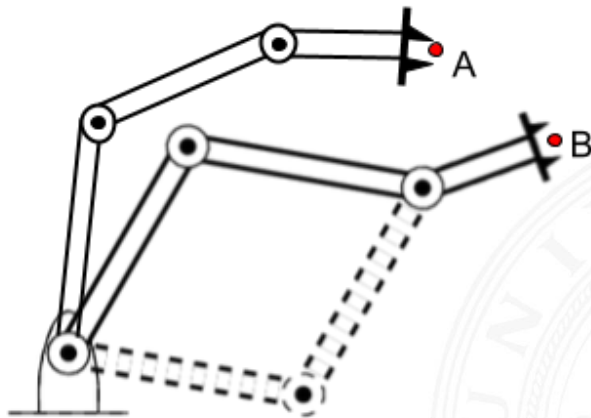
Existence of solutions: Workspace (cont.)



Does the workspace change if joint limits are considered?
For example, $q_1 \in [0, \pi]$, $q_2 \in [0, \pi]$.



Multiple solutions





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

$$n_x = C_1[C_{23}(C_4 C_5 C_6 - S_4 S_6) - S_{23} S_5 C_6] - S_1(S_4 C_5 C_6 + C_4 S_6) \quad (2)$$

$$n_y = S_1[C_{23}(C_4 C_5 C_6 - S_4 S_6 - S_{23} S_5 S_6) + C_1(S_4 C_5 C_6 + C_4 S_6)] \quad (3)$$

$$n_z = -S_{23}[C_4 C_5 C_6 - S_4 S_6] - C_{23} S_5 C_6 \quad (4)$$

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

$$o_x = \dots \quad (5)$$

$$o_y = \dots \quad (6)$$

$$o_z = \dots \quad (7)$$

$$a_x = \dots \quad (8)$$

$$a_y = \dots \quad (9)$$

$$a_z = \dots \quad (10)$$

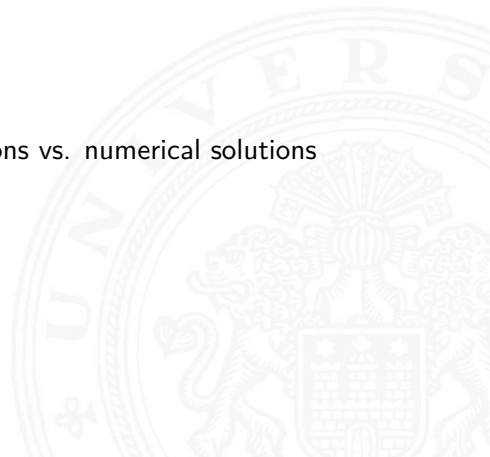
$$p_x = C_1[d_6(C_{23}C_4S_5 + S_{23}C_5) + S_{23}d_4 + a_3C_{23} + a_2C_2] - S_1(d_6S_4S_5 + d_2) \quad (11)$$

$$p_y = S_1[d_6(C_{23}C_4S_5 + S_{23}C_5) + S_{23}d_4 + s_3C_{23} + a_2C_2] + C_1(d_6S_4S_5 + d_2) \quad (12)$$

$$p_z = d_6(C_{23}C_5 - S_{23}C_4S_5) + C_{23}d_4 - a_3S_{23} - a_2S_2 \quad (13)$$



- ▶ Non-linear equations
- ▶ Existence of solutions
- ▶ Multiple solutions
- ▶ Different solution strategy: closed solutions vs. numerical solutions

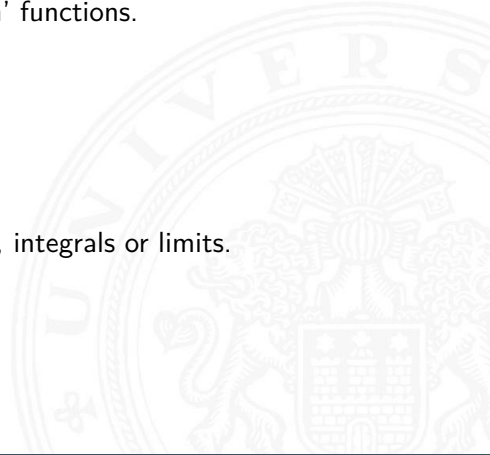




Closed form (analytical):

An expression is said to be a closed-form expression if it can be expressed analytically in terms of a bounded number of certain 'well-known' functions.

- $+ - \times \div$
- nth roots
- exponent and logarithm
- trigonometric and inverse trigonometric functions
- Do not include infinite series, continued fractions, integrals or limits.





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



Algebraic Approach manipulates the given equations into a form whose solution is known.

► Method1: **Transcendental equations**

1. $\sin \theta = a \Rightarrow \theta = A \tan 2(a, \pm\sqrt{1-a^2})$

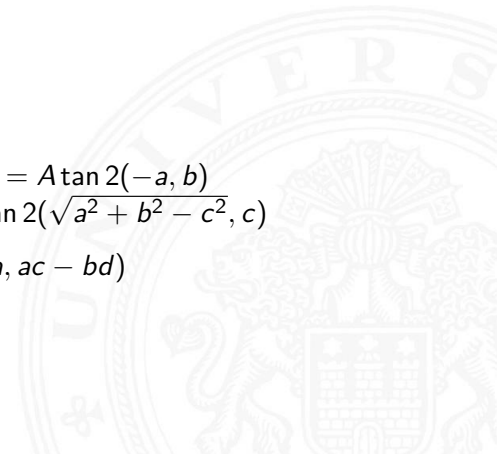
2. $\cos \theta = b \Rightarrow \theta = \pm A \tan 2(\sqrt{1-b^2}, b)$

3. $\begin{cases} \sin \theta = a \\ \cos \theta = b \end{cases} \Rightarrow \theta = A \tan 2(a, b)$

4. $a \cos \theta + b \sin \theta = 0 \Rightarrow \theta = A \tan 2(a, -b)$ or $\theta = A \tan 2(-a, b)$

5. $a \cos \theta + b \sin \theta = c \Rightarrow \theta = A \tan 2(b, a) \pm A \tan 2(\sqrt{a^2 + b^2 - c^2}, c)$

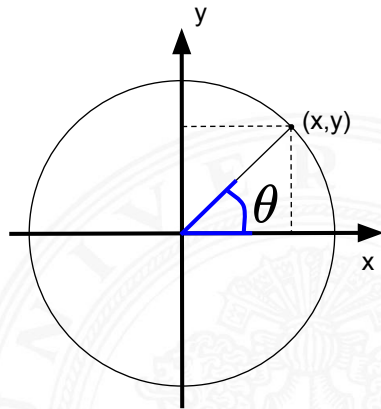
6. $\begin{cases} a \cos \theta - b \sin \theta = c \\ a \sin \theta + b \cos \theta = d \end{cases} \Rightarrow \theta = A \tan 2(ad - ba, ac - bd)$



Algebraic solution (cont.)

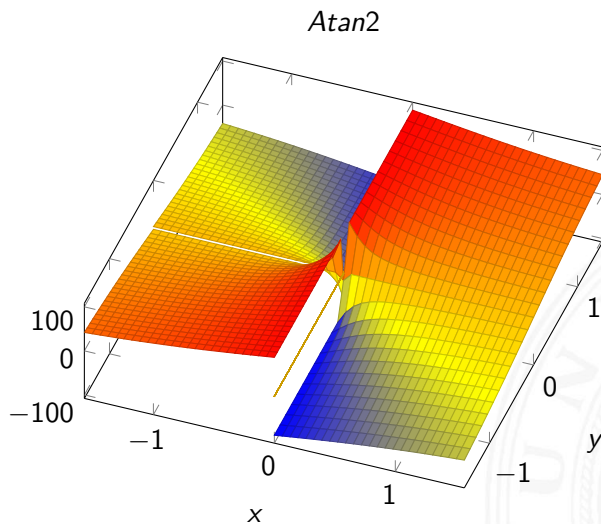
We define the function $Atan2$ as:

$$\theta = Atan2(y, x) = \begin{cases} Atan(\frac{y}{x}) & \text{for } +x \\ Atan(\frac{y}{x}) + \pi & \text{for } -x, +y \\ Atan(\frac{y}{x}) - \pi & \text{for } -x, -y \\ \frac{\pi}{2} & \text{for } x = 0, +y \\ \frac{-\pi}{2} & \text{for } x = 0, -y \\ NaN & \text{for } x = 0, y = 0 \end{cases}$$

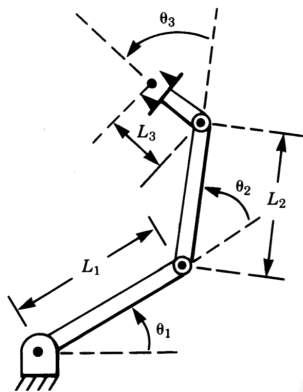




Algebraic solution (cont.)



Example: a planar 3 DOF manipulator



Joint	α_{i-1}	a_{i-1}	d_i	θ_i
1	0	0	0	θ_1
2	0	l_1	0	θ_2
3	0	l_2	0	θ_3

The algebraical solution for the 3 DOF planar

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

with $C_{ij[k]} = \cos(\theta_i + \theta_j [+ \theta_k])$

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

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



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

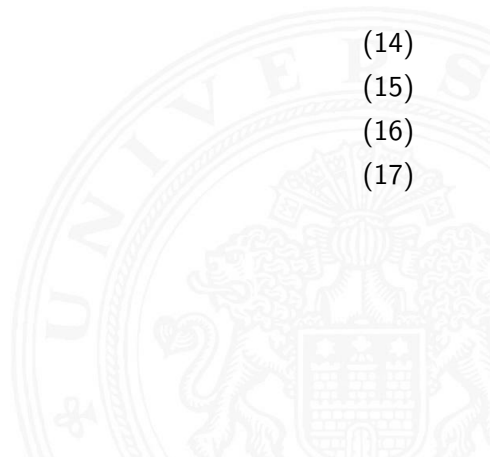
Resultant, four equations can be derived:

$$C_\phi = C_{123} \quad (14)$$

$$S_\phi = S_{123} \quad (15)$$

$$x = l_1 C_1 + l_2 C_{12} \quad (16)$$

$$y = l_1 S_1 + l_2 S_{12} \quad (17)$$





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

Square and add (20) ($x = l_1 C_1 + l_2 C_{12}$) and (21) ($y = l_1 S_1 + l_2 S_{12}$)

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

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 (20) ($x = l_1 C_1 + l_2 C_{12}$) and (21) ($y = l_1 S_1 + l_2 S_{12}$) for θ_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 θ_3 from (19) ($C_\phi = C_{123}$) and (18) ($S_\phi = S_{123}$)

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



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)



Method2: **Reduction to polynomial**

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:

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

$$\Rightarrow \theta = A \tan 2(b, a) \pm A \tan 2(\sqrt{a^2 + b^2 - c^2}, c)$$

After the polynomial conversion:

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

The solution for u :

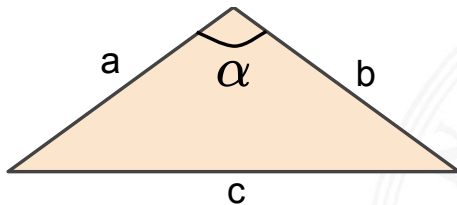
$$u = \frac{b \pm \sqrt{b^2 - a^2 - c^2}}{a + c}$$

Then:

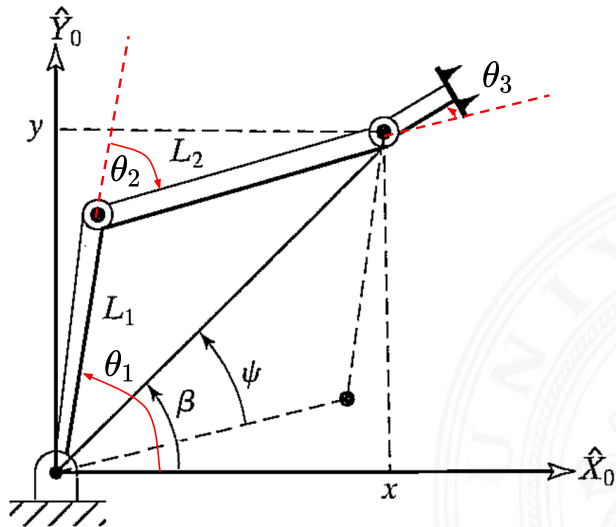
$$\theta = 2 \tan^{-1} \left(\frac{b \pm \sqrt{b^2 - a^2 - c^2}}{a + c} \right)$$



- ▶ Decompose the spatial geometry of the arm into several plane geometry problems
- ▶ Law of cosines: $c^2 = a^2 + b^2 - 2ab \cos \alpha$



The geometrical solution for the example 1





The geometrical solution for the example 1 (cont.)

Calculate θ_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:

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



Assume we have derived the forward kinematics as:

$${}^0T_3 = \begin{bmatrix} C_1 C_{23} & -C_1 S_{23} & S_1 & C_1(C_2 l_2 + l_1) \\ S_1 C_{23} & -S_1 S_{23} & -C_1 & S_1(C_2 l_2 + l_1) \\ S_{23} & C_{23} & 0 & S_2 l_2 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

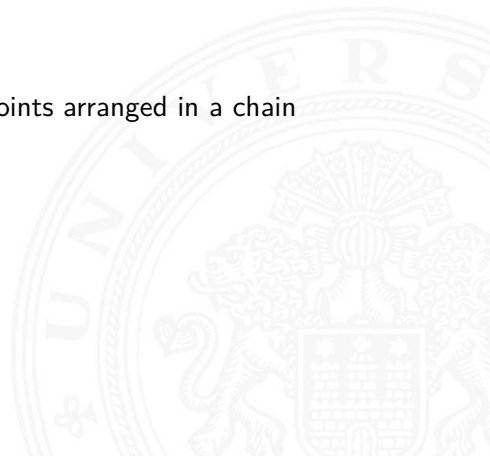
And we know:

$${}^0T_3 = \begin{bmatrix} r_{11} & r_{12} & r_{13} & p_x \\ r_{21} & r_{22} & r_{23} & p_y \\ r_{31} & r_{32} & r_{33} & p_z \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

Question: How to solve the inverse kinematics?

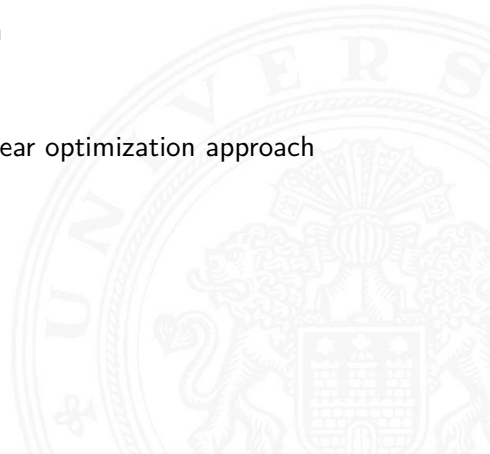


- ▶ Closed-form solutions
- ▶ OpenRAVE
- ▶ faster ($4 \mu s$) but only work with any number of joints arranged in a chain
- ▶ Tutorial: ikfast MoveIt! kinematics_base plugin



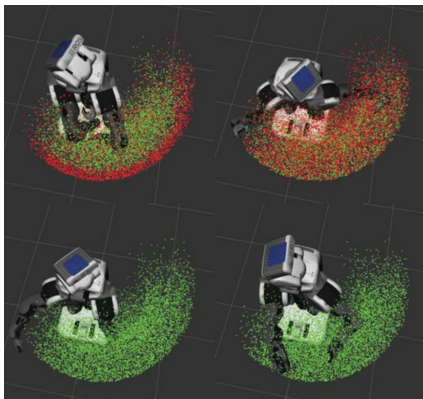


- ▶ TRAC Labs' IK solver
- ▶ Tutorial: `trac_ik` MoveIt! `kinematics_base` plugin
- ▶ two IK implementations:
 - KDL's Newton-based convergence algorithm
 - SQP (Sequential Quadratic Programming) nonlinear optimization approach
- ▶ `trac_ik_python` (RPC)





BioIK 1



KDL

TrackIK

BioIK 2

Download link: [bio_ik MoveIt! kinematics_base plugin](#)

22

²²Ruppel, P., Hendrich, N., Starke, S. and Zhang, J., 2018, May. Cost functions to specify full-body motion and multi-goal manipulation tasks. In 2018 ICRA (pp. 3152-3159). IEEE.



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