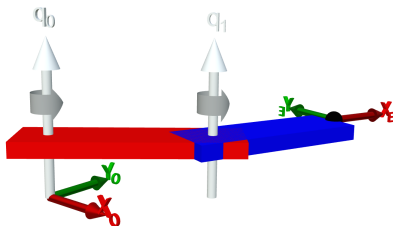


6ELEN018W - Applied Robotics

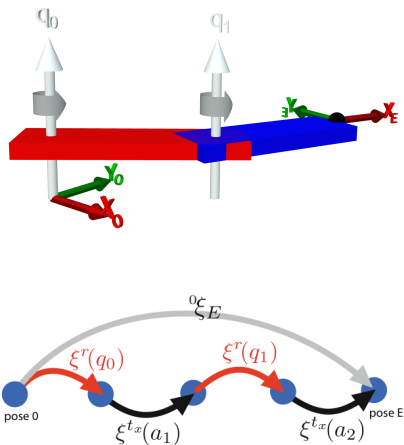
Lecture 4: Robot Motion - 3D Velocity Kinematics

Dr Dimitris C. Dracopoulos

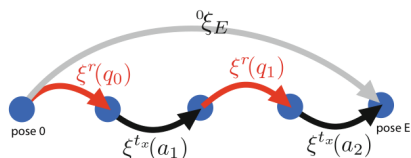
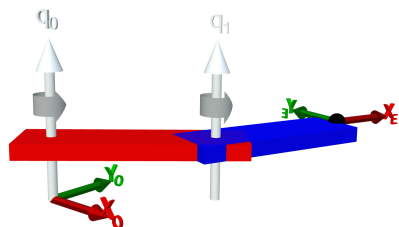
Previously - 2D Pose and Forward Kinematics



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Previously - 2D Pose and Forward Kinematics



The pose of the end-effector is:

$${}^0\xi_E = \xi^r(q_0) \oplus \xi^{t_x}(a_1) \oplus \xi^r(q_1) \oplus \xi^{t_x}(a_2) \quad (1)$$

Previously - 2D Pose and Forward Kinematics (cont'd)

In Python toolbox:

```
>>> a1 = 1
```

Previously - 2D Pose and Forward Kinematics (cont'd)

In Python toolbox:

```
>>> a1 = 1
```

```
>>> a2 = 1
```

Previously - 2D Pose and Forward Kinematics (cont'd)

In Python toolbox:

```
>>> a1 = 1
```

```
>>> a2 = 1
```

```
>>> e = ET2.R()*ET2.tx(a1)*ET2(R)*ET2.tx(a2)
```

Previously - 2D Pose and Forward Kinematics (cont'd)

In Python toolbox:

```
>>> a1 = 1
```

```
>>> a2 = 1
```

```
>>> e = ET2.R()*ET2.tx(a1)*ET2(R)*ET2.tx(a2)
```

```
>>> e.fkine(np.deg2rad([90, 30])).printline()
```


Previously - 2D Pose and Forward Kinematics (cont'd)

In Python toolbox:

```
>>> a1 = 1
```

```
>>> a2 = 1
```

```
>>> e = ET2.R()*ET2.tx(a1)*ET2(R)*ET2.tx(a2)
```

```
>>> e.fkine(np.deg2rad([90, 30])).printline()
```

Equivalently:

```
>>> T = SE2.Rot(np.deg2rad(90)) * SE2.Tx(a1) \
      * SE2.Rot(np.deg2rad(30)) * SE2.Tx(a2)
```

Previously - 2D Pose and Forward Kinematics (cont'd)

In Python toolbox:

```
>>> a1 = 1
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>>> a2 = 1
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```
>>> e = ET2.R()*ET2.tx(a1)*ET2(R)*ET2.tx(a2)
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```
>>> e.fkine(np.deg2rad([90, 30])).printline()
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Equivalently:

```
>>> T = SE2.Rot(np.deg2rad(90)) * SE2.Tx(a1) \
      * SE2.Rot(np.deg2rad(30)) * SE2.Tx(a2)
```

```
>>> T.printline()
```

Previously - 2D Pose and Forward Kinematics (cont'd)

In Python toolbox:

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>>> a1 = 1
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>>> e = ET2.R()*ET2.tx(a1)*ET2(R)*ET2.tx(a2)
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Equivalently:

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>>> T = SE2.Rot(np.deg2rad(90)) * SE2.Tx(a1) \
      * SE2.Rot(np.deg2rad(30)) * SE2.Tx(a2)
```

```
>>> T.printline()
```

```
>>> e.joints()
```

Pose and Forward Kinematics in 3D

Similar approach with the 2D case, apply successive transformations using the 3D homogeneous transformation matrices of size 4×4 .

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>>> a1 = 1
```

```
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Pose and Forward Kinematics in 3D

Similar approach with the 2D case, apply successive transformations using the 3D homogeneous transformation matrices of size 4×4 .

```
>>> a1 = 1
```

```
>>> a2 = 1
```

```
>>> e = ET.Rz() * ET.Ry() \  
      * ET.tz(a1) * ET.Ry() * ET.tz(a2) \  
      * ET.Rz() * ET.Ry() * ET.Rz()
```

Pose and Forward Kinematics in 3D

Similar approach with the 2D case, apply successive transformations using the 3D homogeneous transformation matrices of size 4×4 .

```
>>> a1 = 1
```

```
>>> a2 = 1
```

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>>> e = ET.Rz() * ET.Ry() \  
      * ET.tz(a1) * ET.Ry() * ET.tz(a2) \  
      * ET.Rz() * ET.Ry() * ET.Rz()
```

```
>>> e.n # number of joints
```


Pose and Forward Kinematics in 3D

Similar approach with the 2D case, apply successive transformations using the 3D homogeneous transformation matrices of size 4×4 .

```
>>> a1 = 1
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>>> e = ET.Rz() * ET.Ry() \  
      * ET.tz(a1) * ET.Ry() * ET.tz(a2) \  
      * ET.Rz() * ET.Ry() * ET.Rz()
```

```
>>> e.n # number of joints
```

```
>>> e.structure
```

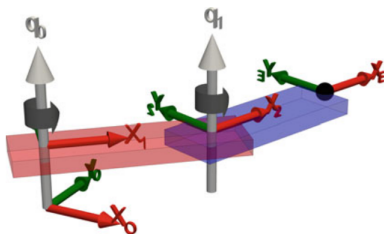
Forward Kinematics as a Chain of Robot Links

A robot can be described as a sequence of links which are attached to joints.

Forward Kinematics as a Chain of Robot Links

A robot can be described as a sequence of links which are attached to joints.

In 2D:

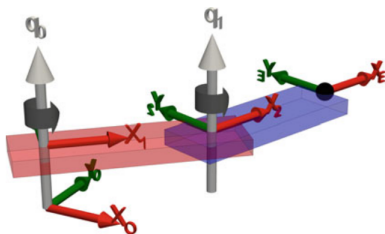


```
>>> a1=1; a2 =1;
```

Forward Kinematics as a Chain of Robot Links

A robot can be described as a sequence of links which are attached to joints.

In 2D:



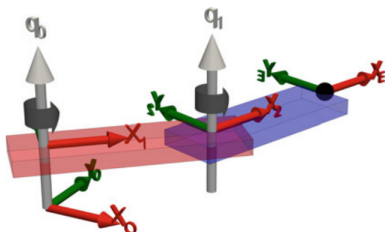
```
>>> a1=1; a2 =1;
```

```
>>> link1 = Link2(ET2.R(), name="link1")
```

Forward Kinematics as a Chain of Robot Links

A robot can be described as a sequence of links which are attached to joints.

In 2D:



```
>>> a1=1; a2 =1;
```

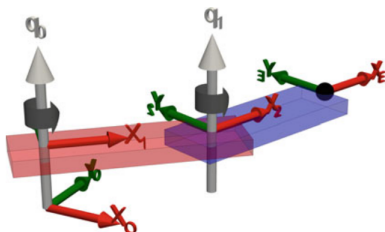
```
>>> link1 = Link2(ET2.R(), name="link1")
```

```
>>> link2 = Link2(ET2.tx(a1)*ET2.R(), name="link2",parent=link1)
```

Forward Kinematics as a Chain of Robot Links

A robot can be described as a sequence of links which are attached to joints.

In 2D:



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>>> link1 = Link2(ET2.R(), name="link1")
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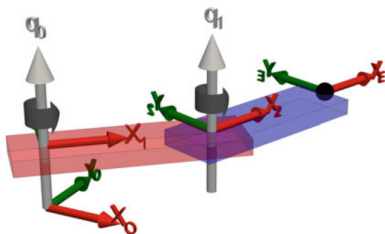
```
>>> link2 = Link2(ET2.tx(a1)*ET2.R(), name="link2",parent=link1)
```

```
>>> link3 = Link2(ET2.tx(a2), name="link3", parent=link2)
```

Forward Kinematics as a Chain of Robot Links

A robot can be described as a sequence of links which are attached to joints.

In 2D:



```
>>> a1=1; a2 =1;
```

```
>>> link1 = Link2(ET2.R(), name="link1")
```

```
>>> link2 = Link2(ET2.tx(a1)*ET2.R(), name="link2",parent=link1)
```

```
>>> link3 = Link2(ET2.tx(a2), name="link3", parent=link2)
```

```
>>> robot = ERobot2([link1, link2, link3], name="my_robot")
```

Forward Kinematics as a Chain of Robot Links (cont'd)

Pose of the end-effector for a specific configuration of the joint angles:

```
>>> robot.fkine(np.deg2rad([30, 40])).printline()
```


Forward Kinematics as a Chain of Robot Links (cont'd)

Pose of the end-effector for a specific configuration of the joint angles:

```
>>> robot.fkine(np.deg2rad([30, 40])).printline()
```

Plot at this configuration:

```
robot.plot(np.deg2rad([30, 40]));
```

Forward Kinematics as a Chain of Robot Links (cont'd)

Pose of the end-effector for a specific configuration of the joint angles:

```
>>> robot.fkine(np.deg2rad([30, 40])).printline()
```

Plot at this configuration:

```
robot.plot(np.deg2rad([30, 40]));
```

Animation between an initial and a target configuration:

```
>>> q = np.array([np.linspace(0, pi, 100), \
                 np.linspace(0, -2*pi, 100)]);
```

Forward Kinematics as a Chain of Robot Links (cont'd)

Pose of the end-effector for a specific configuration of the joint angles:

```
>>> robot.fkine(np.deg2rad([30, 40])).printline()
```

Plot at this configuration:

```
robot.plot(np.deg2rad([30, 40]));
```

Animation between an initial and a target configuration:

```
>>> q = np.array([np.linspace(0, pi, 100), \
                 np.linspace(0, -2*pi, 100)]);
```

```
>>> q = q.T;  # take the transpose of q
```

Forward Kinematics as a Chain of Robot Links (cont'd)

Pose of the end-effector for a specific configuration of the joint angles:

```
>>> robot.fkine(np.deg2rad([30, 40])).printline()
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Plot at this configuration:

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robot.plot(np.deg2rad([30, 40]));
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Animation between an initial and a target configuration:

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>>> q = np.array([np.linspace(0, pi, 100), \
                 np.linspace(0, -2*pi, 100)]);
```

```
>>> q = q.T;  # take the transpose of q
```

```
>> robot.plot(q)
```

Forward Kinematics as a Chain of Robot Links - 3D Case

Rotation about z , rotation about y , translation along z by a_1 ,
rotation about y , translation along z by a_2 , rotation about z ,
rotation about y , rotation about z .

$$e = ET.Rz() * ET.Ry() * ET.tz(a1) * ET.Ry() * ET.tz(a2) * ET.Rz() \backslash \\ * ET.Ry() * ET.Rz() * ET.Rx()$$

Pre-defined Robot Models in the Python Robotics Toolbox

```
>>> models.list(type="ETS")
```

Pre-defined Robot Models in the Python Robotics Toolbox

```
>>> models.list(type="ETS")
```

class	manufacturer	DoF	structure
Panda	Franka Emika	7	RRRRRRR
Frankie	Franka Emika, Omron	9	RPRRRRRRR
Puma560	Unimation	6	RRRRRR
Planar_Y		6	RRRRRR
GenericSeven	Jesse's Imagination	7	RRRRRRR
XYPanda	Franka Emika	9	PPRRRRRRR

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XYPanda	Franka Emika	9	PPRRRRRRR

To create an instance of a Puma560 robot:

Pre-defined Robot Models in the Python Robotics Toolbox

```
>>> models.list(type="ETS")
```

class	manufacturer	DoF	structure
Panda	Franka Emika	7	RRRRRRR
Frankie	Franka Emika, Omron	9	RPRRRRRRR
Puma560	Unimation	6	RRRRRR
Planar_Y		6	RRRRRR
GenericSeven	Jesse's Imagination	7	RRRRRRR
XYPanda	Franka Emika	9	PPRRRRRRR

To create an instance of a Puma560 robot:

```
>>> p560 = models.ETS.Puma560()
```

Pre-defined Robot Models in the Python Robotics Toolbox (cont'd)

A new configuration can be added:

Pre-defined Robot Models in the Python Robotics Toolbox (cont'd)

A new configuration can be added:

```
>>> p560.addconfiguration("my_config", \  
    [0.1, 0.2, 0.3, 0.4, 0.5, 0.6])
```

Pre-defined Robot Models in the Python Robotics Toolbox (cont'd)

A new configuration can be added:

```
>>> p560.addconfiguration("my_config", \  
                          [0.1, 0.2, 0.3, 0.4, 0.5, 0.6])
```

and accessed as a dictionary

Pre-defined Robot Models in the Python Robotics Toolbox (cont'd)

A new configuration can be added:

```
>>> p560.addconfiguration("my_config", \  
                          [0.1, 0.2, 0.3, 0.4, 0.5, 0.6])
```

and accessed as a dictionary

```
>>> p560.configs["my_config"]
```

Pre-defined Robot Models in the Python Robotics Toolbox (cont'd)

A new configuration can be added:

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>>> p560.addconfiguration("my_config", \  
                          [0.1, 0.2, 0.3, 0.4, 0.5, 0.6])
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>>> p560.configs["my_config"]
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The forward kinematics for a configuration can be computed:

Pre-defined Robot Models in the Python Robotics Toolbox (cont'd)

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```

and accessed as a dictionary

```
>>> p560.configs["my_config"]
```

The forward kinematics for a configuration can be computed:

```
>>> p560.fkine(p560.qr)
```

Pre-defined Robot Models in the Python Robotics Toolbox (cont'd)

A new configuration can be added:

```
>>> p560.addconfiguration("my_config", \  
                          [0.1, 0.2, 0.3, 0.4, 0.5, 0.6])
```

and accessed as a dictionary

```
>>> p560.configs["my_config"]
```

The forward kinematics for a configuration can be computed:

```
>>> p560.fkine(p560.qr)
```

print the pose in compact form

```
>>> p560.fkine(p560.qr).printline()
```


Pre-defined Robot Models in the Python Robotics Toolbox (cont'd)

A new configuration can be added:

```
>>> p560.addconfiguration("my_config", \  
                          [0.1, 0.2, 0.3, 0.4, 0.5, 0.6])
```

and accessed as a dictionary

```
>>> p560.configs["my_config"]
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The forward kinematics for a configuration can be computed:

```
>>> p560.fkine(p560.qr)  
# print the pose in compact form  
>>> p560.fkine(p560.qr).printline()
```

plotted in a configuration:

Pre-defined Robot Models in the Python Robotics Toolbox (cont'd)

A new configuration can be added:

```
>>> p560.addconfiguration("my_config", \  
    [0.1, 0.2, 0.3, 0.4, 0.5, 0.6])
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>>> p560.configs["my_config"]
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The forward kinematics for a configuration can be computed:

```
>>> p560.fkine(p560.qr)  
# print the pose in compact form  
>>> p560.fkine(p560.qr).printline()
```

plotted in a configuration:

```
>>> p560.plot(p560.qr)
```

Motion in 3D

Previously covered: If the joints move at specific velocities, what is the velocity of the end-effector? (2D case)

- ▶ *Rate of change of position:* Speed (velocity): $\mathbf{v} = (\dot{x}, \dot{y}, \dot{z})$

Motion in 3D

Previously covered: If the joints move at specific velocities, what is the velocity of the end-effector? (2D case)

- ▶ *Rate of change of position:* Speed (velocity): $\mathbf{v} = (\dot{x}, \dot{y}, \dot{z})$
- ▶ *Rate of change of orientation:* Angular velocity:
 $\boldsymbol{\omega} = (\omega_x, \omega_y, \omega_z) = (\dot{q}_x, \dot{q}_y, \dot{q}_z)$

Motion in 3D

Previously covered: If the joints move at specific velocities, what is the velocity of the end-effector? (2D case)

- ▶ *Rate of change of position:* Speed (velocity): $\mathbf{v} = (\dot{x}, \dot{y}, \dot{z})$
- ▶ *Rate of change of orientation:* Angular velocity:
 $\boldsymbol{\omega} = (\omega_x, \omega_y, \omega_z) = (q_x, q_y, q_z)$

All of these are with reference to a specific coordinate frame (or simply the *reference coordinate frame*).

Translational and Rotational Motion of a Robot's End-Effector



Translational and Rotational Motion of a Robot's End-Effector



The spatial velocity (twist) consists of:

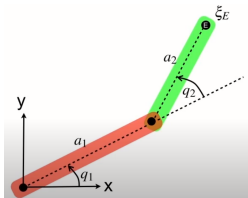
Translational and Rotational Motion of a Robot's End-Effector



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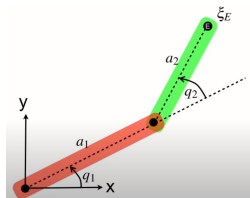
$$\mathcal{V} = (v_x, v_y, v_z, \omega_x, \omega_y, \omega_z)$$

Previously - End-Effector Velocity in a 2-Joint Robot (2D)



$$\begin{pmatrix} x \\ y \end{pmatrix} = \begin{pmatrix} a_1 \cos(q_1) + a_2 \cos(q_1 + q_2) \\ a_1 \sin(q_1) + a_2 \sin(q_1 + q_2) \end{pmatrix}$$

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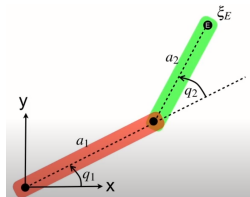


$$\begin{pmatrix} x \\ y \end{pmatrix} = \begin{pmatrix} a_1 \cos(q_1) + a_2 \cos(q_1 + q_2) \\ a_1 \sin(q_1) + a_2 \sin(q_1 + q_2) \end{pmatrix}$$

- ▶ If joint angles change over time (the robot moves):

$$q_1 = q_1(t), \quad q_2 = q_2(t)$$

Previously - End-Effector Velocity in a 2-Joint Robot (2D)



$$\begin{pmatrix} x \\ y \end{pmatrix} = \begin{pmatrix} a_1 \cos(q_1) + a_2 \cos(q_1 + q_2) \\ a_1 \sin(q_1) + a_2 \sin(q_1 + q_2) \end{pmatrix}$$

- ▶ If joint angles change over time (the robot moves):

$$q_1 = q_1(t), \quad q_2 = q_2(t)$$

- ▶ The velocity of the end-effector can be calculated by computing the derivative (using the chain rule):

$$\dot{x} = -a_1 \dot{q}_1 \sin(q_1) - a_2 (\dot{q}_1 + \dot{q}_2) \sin(q_1 + q_2)$$

$$\dot{y} = a_1 \dot{q}_1 \cos(q_1) + a_2 (\dot{q}_1 + \dot{q}_2) \cos(q_1 + q_2)$$

Previously - End-Effector Velocity in a 2-Joint Robot (2D)

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The Jacobian $\mathbf{J}(\mathbf{q})$:

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

Jacobian Calculation in the Python Robotics Toolbox

```
>>> import sympy
```

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>>> p = TE.t
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The Jacobian is calculated:

```
>>> J = Matrix(p).jacobian(q)
```

Jacobian Calculation in the Python Robotics Toolbox

```
>>> import sympy
```

```
>>> a1, a2 = sympy.symbols("a1, a2")
```

```
>>> e = ERobot2(ET2.R()*ET2.tx(a1)*ET2.R()*ET2.tx(a2))
```

```
>>> q = symbols("q:2") # sympy is already imported
```

The forward kinematics are calculated as:

```
>>> TE = e.fkine(q)
```

Translation part, i.e location of end-effector $\mathbf{p} = (x, y)$:

```
>>> p = TE.t
```

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The velocity of the end-effector is calculated as:

$$\dot{\mathbf{p}} = \mathbf{J}(\mathbf{q})\dot{\mathbf{q}} \quad (2)$$

General Form of the Forward Kinematics using the Jacobian

The derivative of the spatial velocity $\boldsymbol{\nu}$ of the end-effector can be written as:

$$\boldsymbol{\nu} = \begin{pmatrix} v_x \\ v_y \\ v_z \\ \omega_x \\ \omega_y \\ \omega_z \end{pmatrix} = \mathbf{J}(\mathbf{q})\dot{\mathbf{q}}$$

where $\mathbf{J}(\mathbf{q})$ is an $M \times N$ matrix.

- ▶ $M = 6$ is the dimension of the task space (3 translational and 3 rotational velocity components)
- ▶ N is the number of robot joints

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>>> p560.teach(p560.qr)
```

Velocity of a n -joint Robot Arm

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How to do this then?

- ▶ Relationship between a change of a single joint and the change in the end-effector.

Simple Numerical Calculation of Derivatives

In a numerical simulation, if we take small enough time steps, the derivative can be calculated as:

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- ▶ Use the `jacob0` method of the toolbox instead.

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- ▶ Unless the matrix is singular (the determinant is zero), in which case the inverse cannot be calculated!

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>>> np.linalg.inv(J)
```

How to Control the Spatial Velocity of an End-Effector?

1. Choose the spatial velocity $\boldsymbol{\nu} = (v_x, v_y, v_z, \omega_x, \omega_y, \omega_z)$
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5. The Jacobian $\mathbf{J}(\mathbf{q})$ needs to be re-calculated.

How to Write a Program to Control the Spatial Velocity of the End-Effector

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Repeat for ever:

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4. $k = k + 1$

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$$\mathbf{J}^+ = (\mathbf{J}^T \mathbf{J})^{-1} \mathbf{J}^T$$