



# Robot Velocity

We have the need for speed



Last update: January 17, 2022

# Agenda

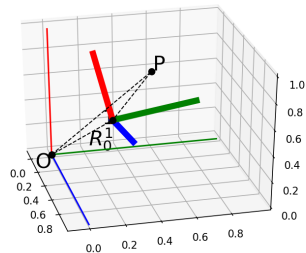
- Background
- Linear and angular velocity
- The Jacobian
- Inverting the Jacobian - Singularities
- Velocity eclipse



# Recap

What do we know already?

$$P_0 = R_0^1 * P_1$$



# Recap

What we know already?

## Definition

A transformation matrix that calculates the pose of the robot's end effector in terms of the joint coordinates  $q_1, q_2, \dots, q_n$

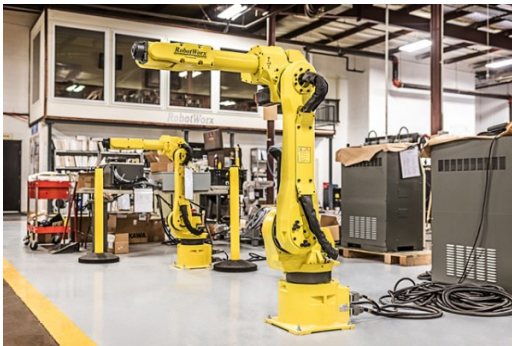
$$\left[ \begin{array}{ccc|c} X_X & Y_X & Z_X & P_x \\ X_Y & Y_Y & Z_Y & P_y \\ X_Z & Y_Z & Z_Z & P_z \\ \hline 0 & 0 & 0 & 1 \end{array} \right]$$



# Robot velocity

## Background

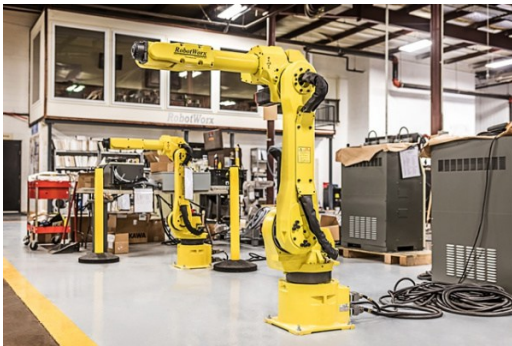
A robot is a mechanism which consists of joints and links.



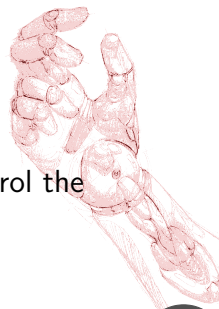
# Robot velocity

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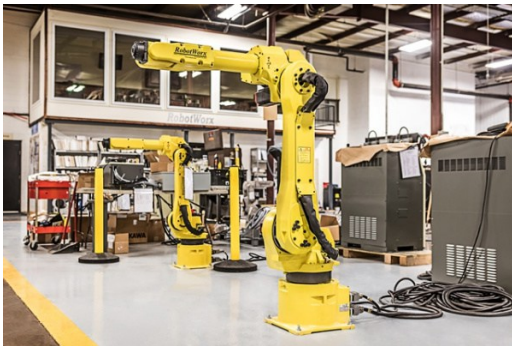
By controlling the position of the joints, we can control the position of the end-effector.



# Robot velocity

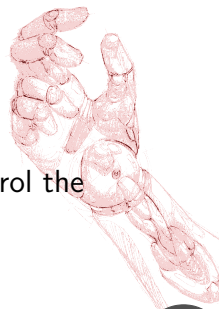
## Background

A robot is a mechanism which consists of joints and links.



By controlling the position of the joints, we can control the position of the end-effector.

Can we do this for velocities as well?



# Robot velocity

## Background

We define a matrix called the 'Jacobian' that shows us how can we calculate the end-effector velocity if we know the joint velocities

$$\xi = J\dot{q}$$



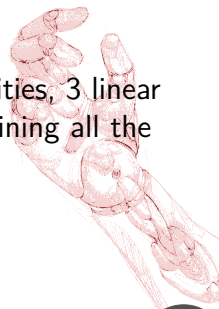


# Robot velocity

## The Jacobian

$$\begin{bmatrix} \dot{x} \\ \dot{y} \\ \dot{z} \\ \omega_x \\ \omega_y \\ \omega_z \end{bmatrix} = \xi = J\dot{q} = J \begin{bmatrix} \dot{q}_1 \\ \dot{q}_2 \\ \vdots \\ \dot{q}_n \end{bmatrix}$$

By vector  $\xi$  we denote a vector that contains 6 velocities, 3 linear and 3 angular. By vector  $\dot{q}$  we denote a vector containing all the  $n$  joint velocities.



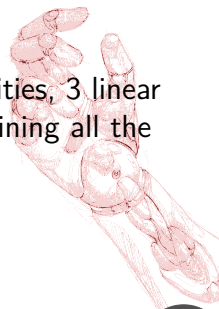
# Robot velocity

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By vector  $\xi$  we denote a vector that contains 6 velocities, 3 linear and 3 angular. By vector  $\dot{q}$  we denote a vector containing all the  $n$  joint velocities.

What is the size of the Jacobian matrix  $J$ ?



# Robot velocity

## The Jacobian

The Jacobian is a matrix of  $6 \times n$  (six rows and  $n$  columns).  
The first three rows, related to the linear velocities  $u$ , the last three to the angular velocities  $\omega$ .

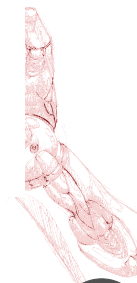
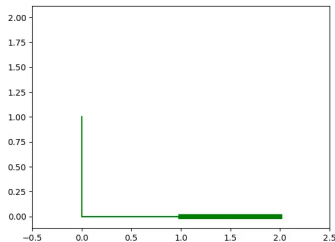
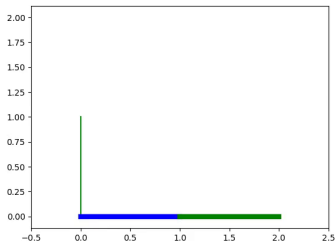
$$\begin{bmatrix} u \\ \omega \end{bmatrix} = \begin{bmatrix} J_u \\ J_\omega \end{bmatrix} \dot{q}$$



# Linear and angular velocity

What is the difference?

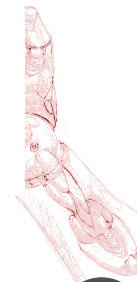
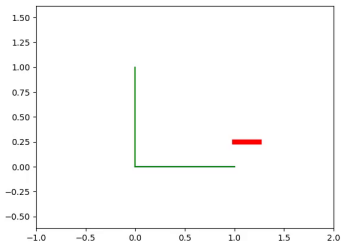
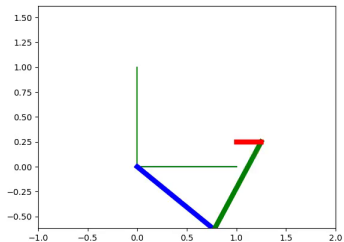
Each of the robot segments can be moving with a linear, angular velocity, or a combination of the two.



# Linear and angular velocity

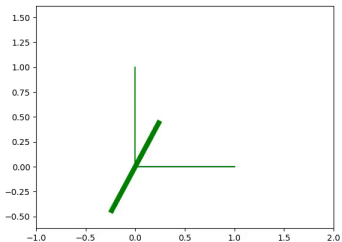
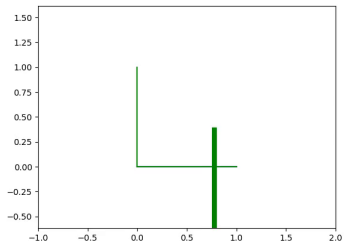
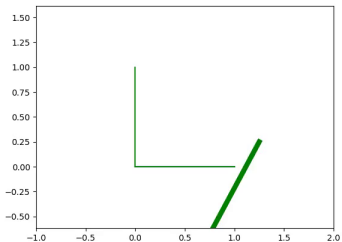
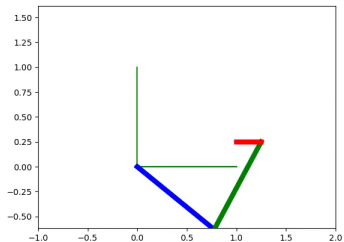
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Each of the robot segments can be moving with a linear, angular or a complex velocity.



# Linear and angular velocity

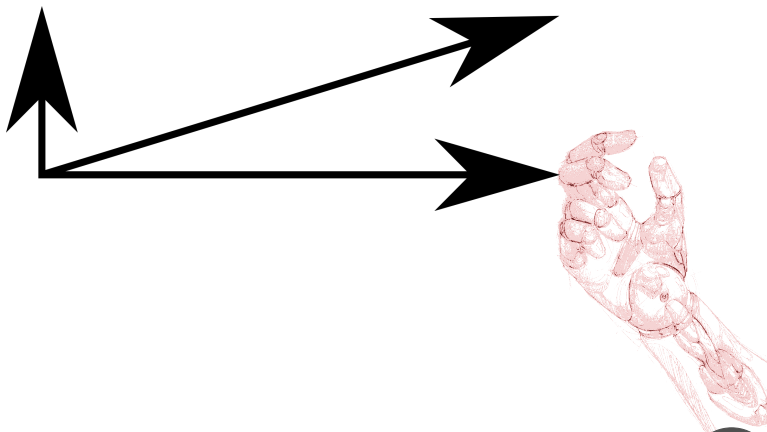
What is the difference?



# What is linear velocity

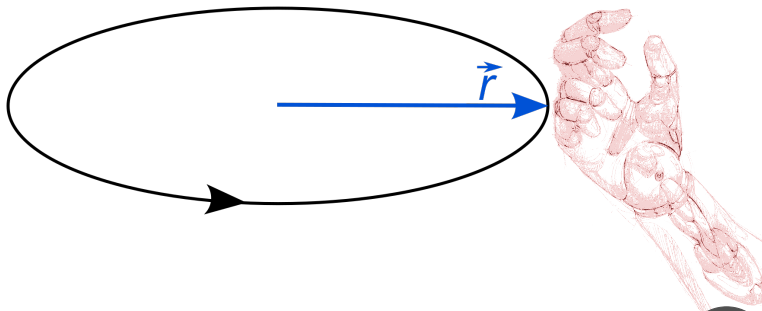


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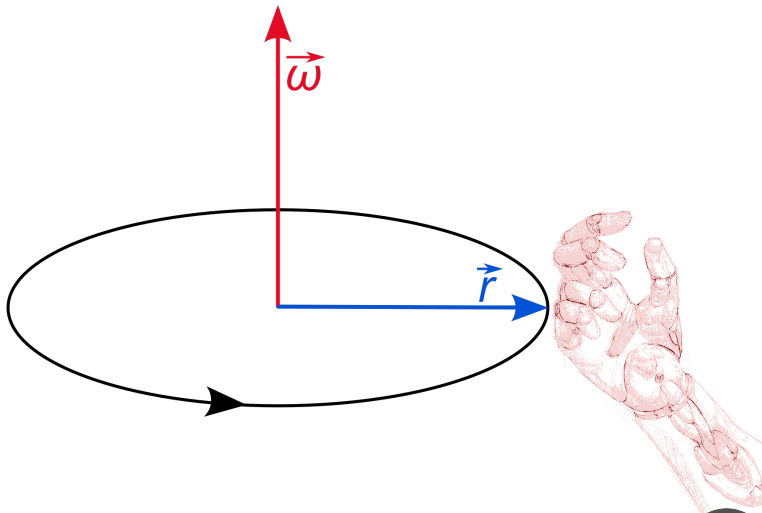




# What is angular velocity



# What is angular velocity



# Defining the Jacobian

## Angular velocities

We are looking for a relationship between joint velocities and angular velocity of the end-effector.

$$\omega = J_{\omega} \dot{q}$$



# Defining the Jacobian

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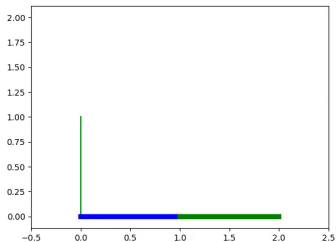
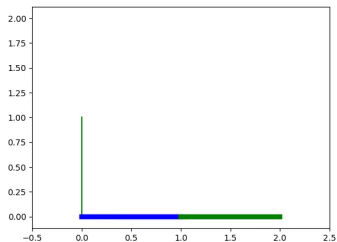
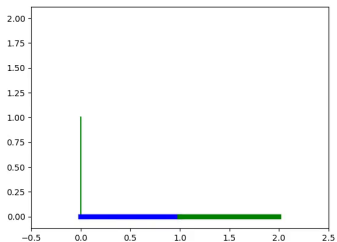
$$\omega = J_{\omega} \dot{q}$$

What is the dimension of  $J_{\omega}$ ?



# Defining the Jacobian

## Addition of Angular velocities

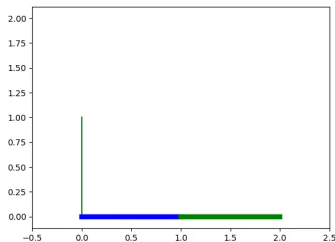


# Defining the Jacobian

## Angular velocities

We can add the angular velocities of each segment to calculate the angular velocity of the end effector.

$$\omega_0^n = \dot{q}_1 + \dot{q}_2 + \dots + \dot{q}_n$$



# Defining the Jacobian

Angular velocities

What happens if we have motion in  $\mathbb{R}^3$ ?



# Defining the Jacobian

## Angular velocities

What happens if we have motion in  $\mathbb{R}^3$ ?

In the general case, we need to express/transform the angular velocity of each segment to the base coordinate frame.

$$\omega_0^n = \rho_1 R_0^1 \dot{q}_1 + \rho_2 R_0^2 k \dot{q}_2 + \dots + \rho_n R_0^n k \dot{q}_n$$





# Defining the Jacobian

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Where  $k$  is the unit coordinate vector  $(0, 0, 1)^T$



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Where  $k$  is the unit coordinate vector  $(0, 0, 1)^T$

$R_0^n$  is the **rotation** matrix from base to joint  $n$ , as calculated by the DH convention.

And  $\rho_i$  is equal to 1 if joint  $i$  is revolute and 0 if joint  $i$  is prismatic. Why?



# Defining the Jacobian

Angular velocities

What is the result of:

$$R_0^n k$$



# Defining the Jacobian

## Angular velocities

What is the result of:

$$R_0^n k$$

$$\begin{bmatrix} X_X & Y_X & Z_X \\ X_Y & Y_Y & Z_Y \\ X_Z & Y_Z & Z_Z \end{bmatrix} \begin{bmatrix} 0 \\ 0 \\ 1 \end{bmatrix} = \begin{bmatrix} Z_X \\ Z_Y \\ Z_Z \end{bmatrix} = z_n$$

What does  $z_n$  represent in DH convention?



# Defining the Jacobian

## Angular velocities

We have therefore defined a relationship that shows us how the joint coordinates  $q$  relate to the angular velocity of the end-effector  $\omega$

$$\omega = \begin{bmatrix} \rho_1 z_1, \rho_2 z_2, \dots, \rho_n z_n \end{bmatrix} \dot{q}$$



# Defining the Jacobian

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Therefore, the Jacobian for the angular velocities is:

$$J_\omega = \begin{bmatrix} \rho_1 z_1, \rho_2 z_2, \dots, \rho_n z_n \end{bmatrix}$$



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Therefore, the Jacobian for the angular velocities is:

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What dimension does it have?



# Defining the Jacobian

## Linear velocities

We are looking for a relationship between joint velocities and linear velocity of the end-effector.

$$u = J_u \dot{q}$$

What is the dimension of  $J_u$  ?





# Defining the Jacobian

## Linear velocities

We can visualise that the linear velocity of the end-effector is equal to the linear velocity of the joint for **Prismatic** joints.



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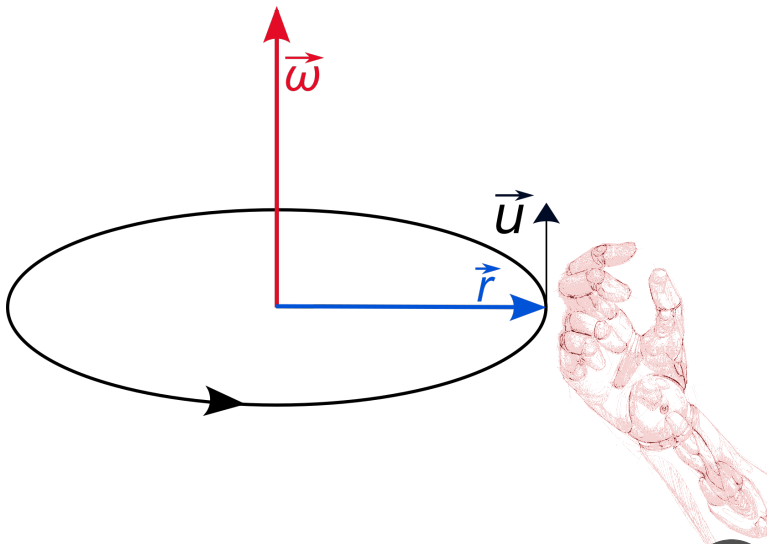
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What is  $z_i$ ?



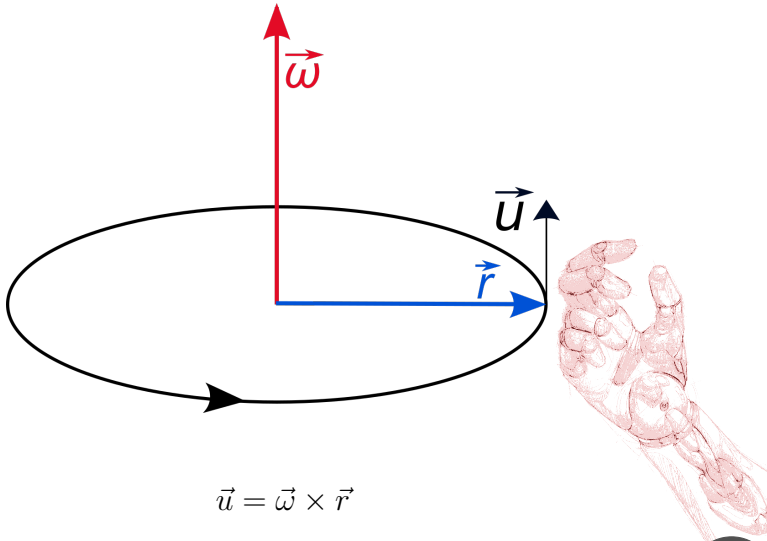
# Defining the Jacobian

Linear velocity of a rotating body



# Defining the Jacobian

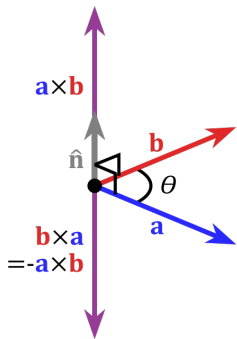
Linear velocity of a rotating body



$$\vec{u} = \vec{\omega} \times \vec{r}$$

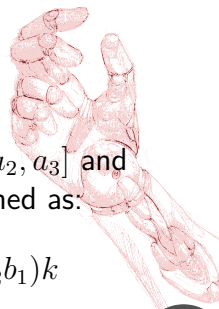
# Defining the Jacobian

What is the cross product?



If we have two vectors  $a$  and  $b$  with coordinates  $[a_1, a_2, a_3]$  and  $[b_1, b_2, b_3]$  respectively then, the cross product is defined as:

$$a \times b = (a_2b_3 - a_3b_2)i + (a_3b_1 - a_1b_3)j + (a_1b_2 - a_2b_1)k$$



# Defining the Jacobian

## Linear velocities

For a revolute joint, the column of the linear Jacobian for that joint is equal to the cross product of the axis of the joint and the vector connecting the end-effector with the joint

$$J_{u_i} = z_i \times (o_{n+1} - o_i)$$



# Defining the Jacobian

## Combining angular and linear velocities

We can calculate each column of the Jacobian matrix individually. Each column represents one joint. If joint  $i$  is revolute, then:

$$J_i = \begin{bmatrix} z_i \times (o_{n+1} - o_i) \\ z_i \end{bmatrix}$$

If joint  $i$  is prismatic, then:

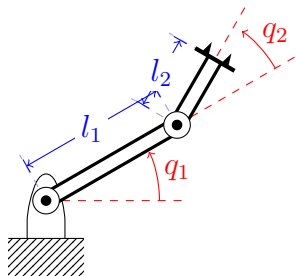
$$J_i = \begin{bmatrix} z_i \\ 0 \end{bmatrix}$$





# Defining the Jacobian

Example in  $\mathbb{R}^2$

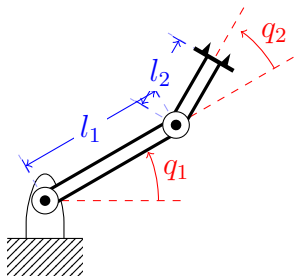


$$R_0^1 = \begin{bmatrix} c_1 & -s_1 & 0 & 0 \\ s_1 & c_1 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$



# Defining the Jacobian

Example in  $\mathbb{R}^2$



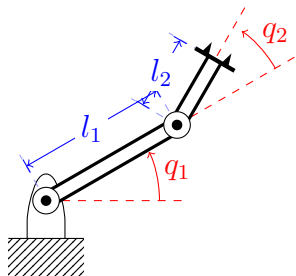
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$$R_0^2 = \begin{bmatrix} c_{1,2} & -s_{1,2} & 0 & l_1 c_1 \\ s_{1,2} & c_{1,2} & 0 & l_1 s_1 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$



# Defining the Jacobian

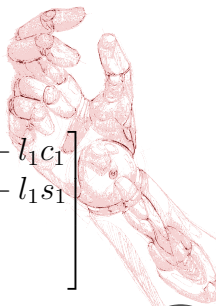
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$$R_0^3 = \begin{bmatrix} c_{1,2} & -s_{1,2} & 0 & l_2 c_{1,2} + l_1 c_1 \\ s_{1,2} & c_{1,2} & 0 & l_2 s_{1,2} + l_1 s_1 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$



# Defining the Jacobian

## 2 link planar manipulator

$$R_0^1 = \begin{bmatrix} c_1 & -s_1 & 0 & 0 \\ s_1 & c_1 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix} \quad R_0^2 = \begin{bmatrix} c_{1,2} & -s_{1,2} & 0 & l_1 c_1 \\ s_{1,2} & c_{1,2} & 0 & l_1 s_1 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

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$$J = \begin{bmatrix} z_1 \times (o_3 - o_1) & z_2 \times (o_3 - o_2) \\ z_1 & z_2 \end{bmatrix}$$



# Defining the Jacobian

## 2 link planar manipulator

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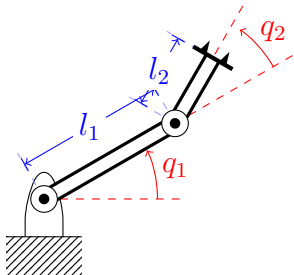
where:

$$o_1 = \begin{bmatrix} 0 \\ 0 \\ 0 \end{bmatrix}, o_2 = \begin{bmatrix} l_1 c_1 \\ l_1 s_1 \\ 0 \end{bmatrix}, o_3 = \begin{bmatrix} l_1 c_1 + l_2 c_{1,2} \\ l_1 s_1 + l_2 s_{1,2} \\ 0 \end{bmatrix}, z_1 = z_2 = \begin{bmatrix} 0 \\ 0 \\ 1 \end{bmatrix}$$



# Defining the Jacobian

2 link planar manipulator

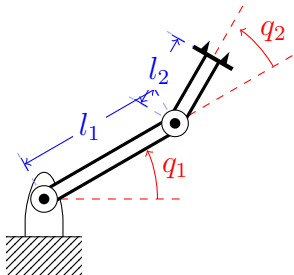


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# Defining the Jacobian

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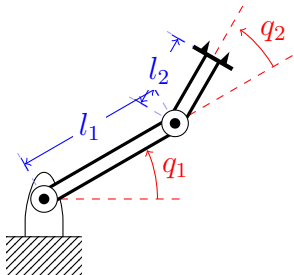
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The Jacobian is a function of joint coordinates!



# Defining the Jacobian

## 2 link planar manipulator



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How do we 'use' the Jacobian?





# Jacobian

## Inverse velocity

We now have a method to define the end-effector velocity (angular and linear) based on the joint velocities

$$\xi = J\dot{q}$$



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How do we do the opposite (i.e. define the joint velocities for specific end-effector velocity)?



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$$J^{-1}\xi = \dot{q}$$



# Jacobian

Inverting the velocity

Is  $J$  always invertible?



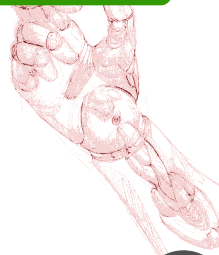
# Jacobian

Inverting the velocity

Is  $J$  always invertible?

## Conditions for Jacobian invertibility

- The Jacobian must be square
- The rank of the Jacobian must be equal to its size



# Jacobian

## Inverting the velocity

Is  $J$  always invertible?

### Conditions for Jacobian invertibility

- The Jacobian must be square
- The rank of the Jacobian must be equal to its size

For achieving any velocity in  $\mathbb{R}^3$ , the Jacobian must be  $6 \times 6$ .  
What do we need for such a Jacobian?



# Jacobian

## The pseudoinverse

In the cases we cannot invert the Jacobian (e.g. we have redundant joints), we can calculate the *pseudoinverse*.





# Jacobian

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*For  $J \in \mathbb{R}^{m \times n}$ , if  $m < n$ , then  $(JJ^T)^{-1}$  exists.*



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$$(JJ^T)(JJ^T)^{-1} = I$$

$$J[J^T(JJ^T)^{-1}] = I$$

$$JJ^+ = I$$

where:

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



# Jacobian

## The pseudoinverse

In the cases we cannot invert the Jacobian (e.g. we have redundant joints), we can calculate the *pseudoinverse*.

For  $J \in \mathbb{R}^{m \times n}$ , if  $m < n$ , then  $(JJ^T)^{-1}$  exists.

$$\begin{aligned}(JJ^T)(JJ^T)^{-1} &= I \\ J[J^T(JJ^T)^{-1}] &= I \\ JJ^+ &= I\end{aligned}$$

where:

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

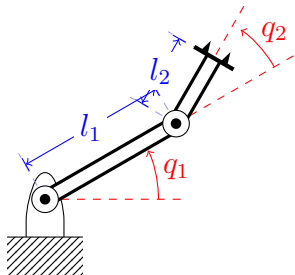
therefore:

$$\dot{q} = J^+ \xi$$



# Jacobian inverse

## 2 link planar manipulator



$$J_u = \begin{bmatrix} -l_1 s_1 - l_2 s_{1,2} & -l_2 s_{1,2} \\ l_1 c_1 + l_2 c_{1,2} & l_2 c_{1,2} \end{bmatrix}$$

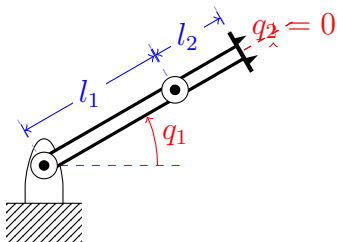
$$J_u^{-1} = \frac{1}{l_1 l_2 s_2} \begin{bmatrix} l_2 c_{1,2} & l_2 s_{1,2} \\ -l_1 c_1 - l_2 c_{1,2} & -l_1 s_1 - l_2 s_{1,2} \end{bmatrix}$$



# Jacobian inverse

## 2 link planar manipulator

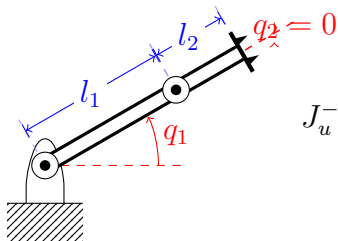
What happens when  $\dot{q}_2 = 0$ ?



# Jacobian inverse

## 2 link planar manipulator

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# Jacobian

## Singularities

The Jacobian is a function of the joint coordinates  $q$ , and therefore it varies for different robot configurations.



# Jacobian

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The Jacobian is a function of the joint coordinates  $q$ , and therefore it varies for different robot configurations.

In some cases, the Jacobian might lose rank, or might become non-invertible, or its determinant might become zero (which is practically the same thing)

In such cases, the robot loses dexterity, or even a degree of freedom.





# Robot manipulability

Why does this all matter?

The Jacobian allows us to map joint velocities to end-effector velocities. We have seen that at different configurations, we have a different map (since  $J$  depends on  $q$ ).



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Can we quantify how much dexterity our robot has at different configurations? (i.e. manipulability?)

*hint: yes!*



# Robot manipulability

## Velocity ellipse

We model our robot as an input-output system (input is joint velocities, output is end-effector velocities). If we consider unit inputs, then we have:

$$\dot{q}^T \dot{q} = 1$$

which we can write as:

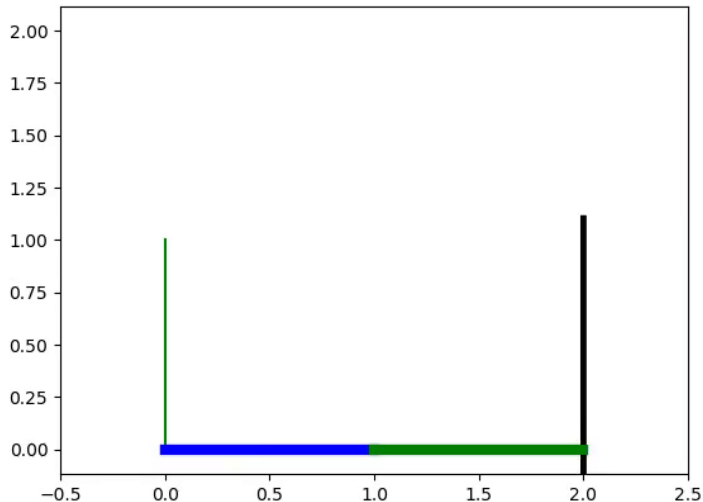
$$\xi^T (J J^T)^{-1} \xi = 1$$

which is the equation of an ellipse



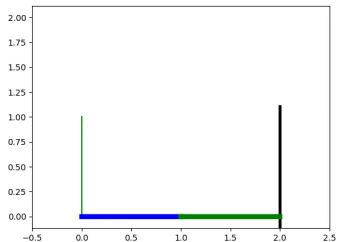
# Robot manipulability

Velocity ellipse



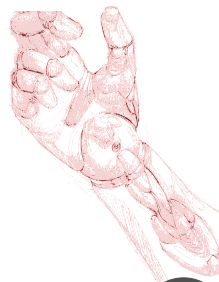
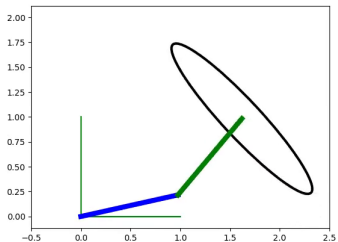
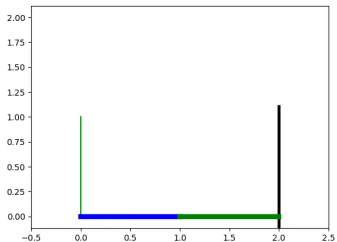
# Robot manipulability

## Velocity ellipse



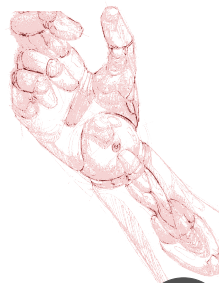
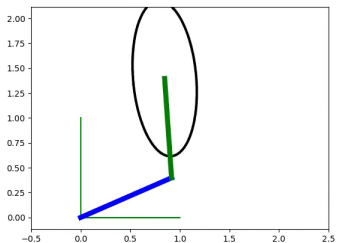
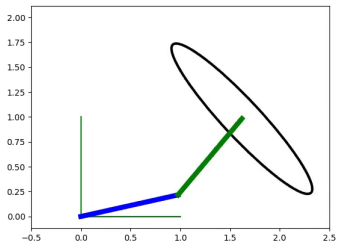
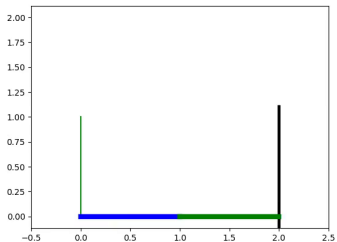
# Robot manipulability

## Velocity ellipse



# Robot manipulability

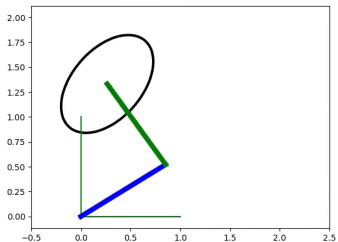
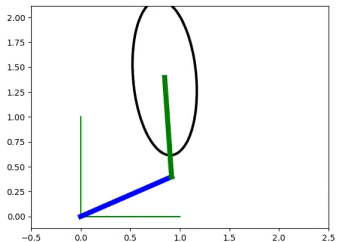
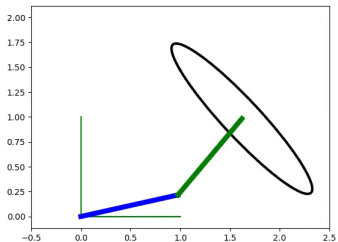
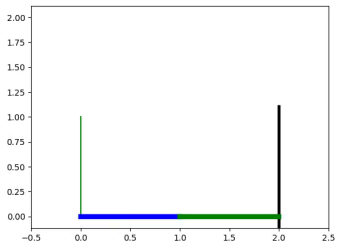
## Velocity ellipse





# Robot manipulability

## Velocity ellipse





# Questions?