#### Forward Kinematics

Jie Tan Google DeepMind

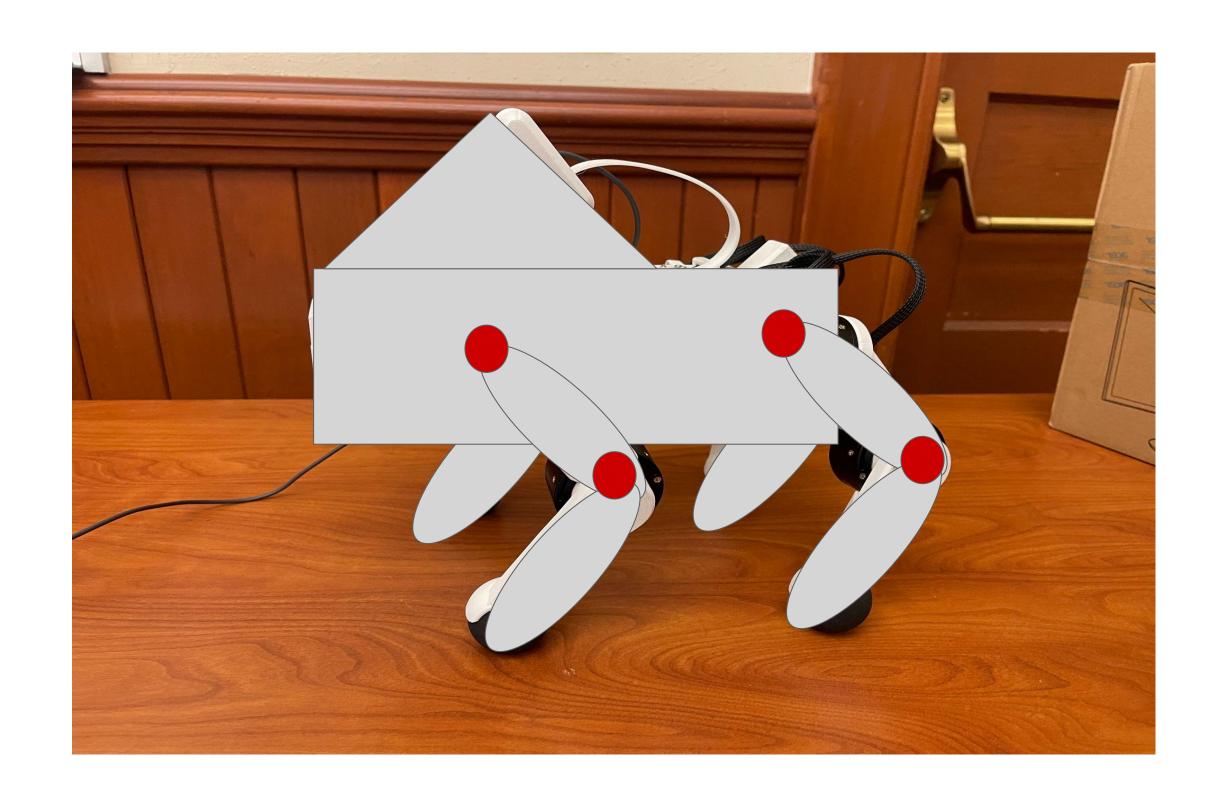
Apr 7, 2025

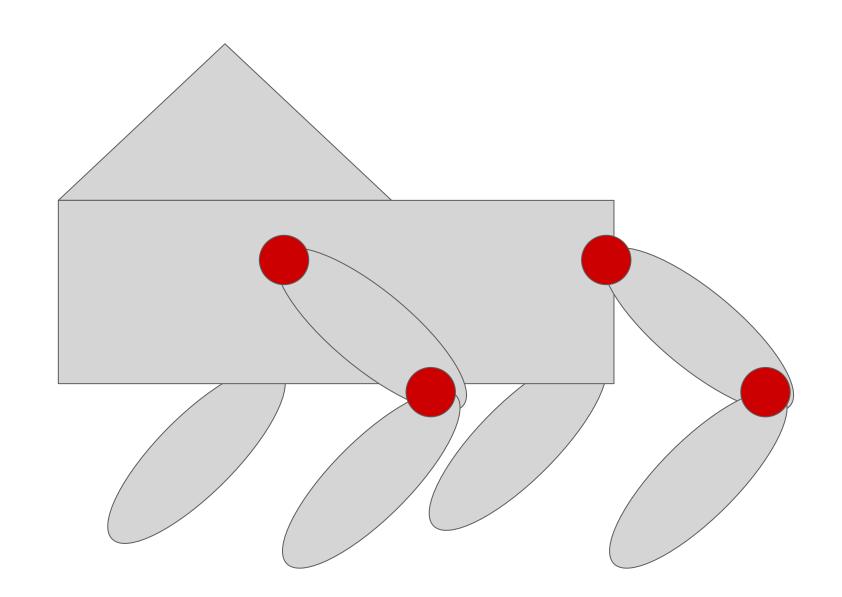
#### Goal

What is Forward Kinematics (FK)?

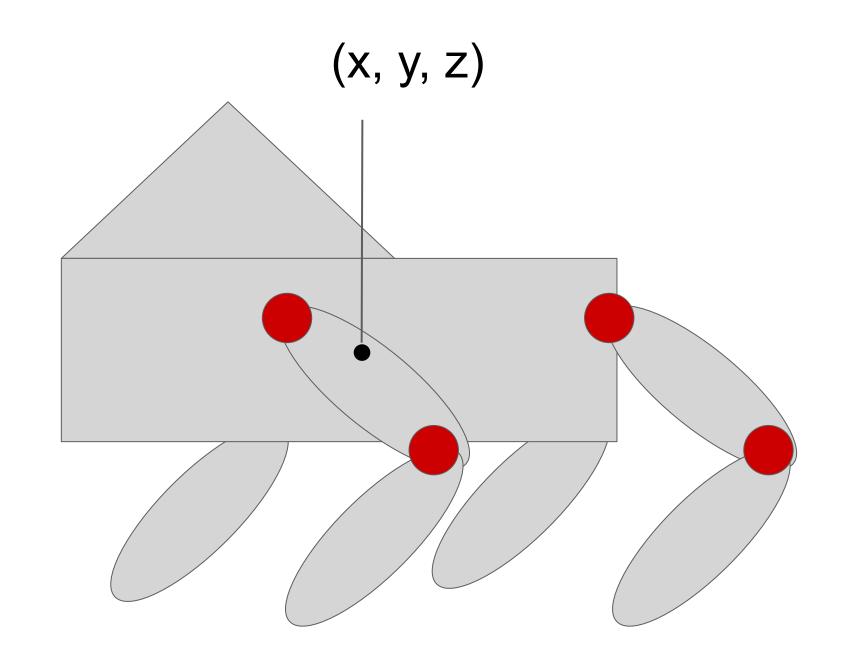
Why is FK important in robotics?

How to calculate FK?

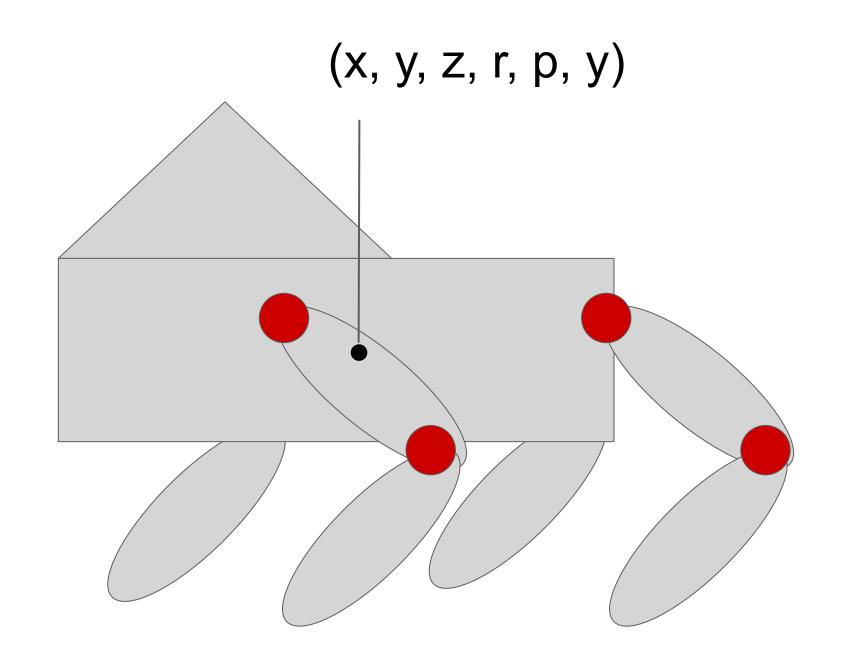




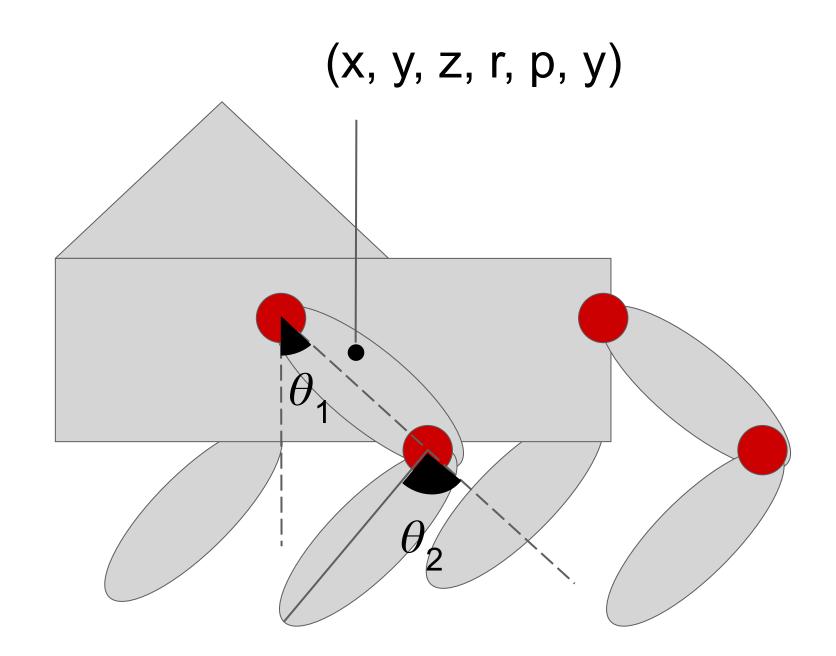
Pose: **q** = ?



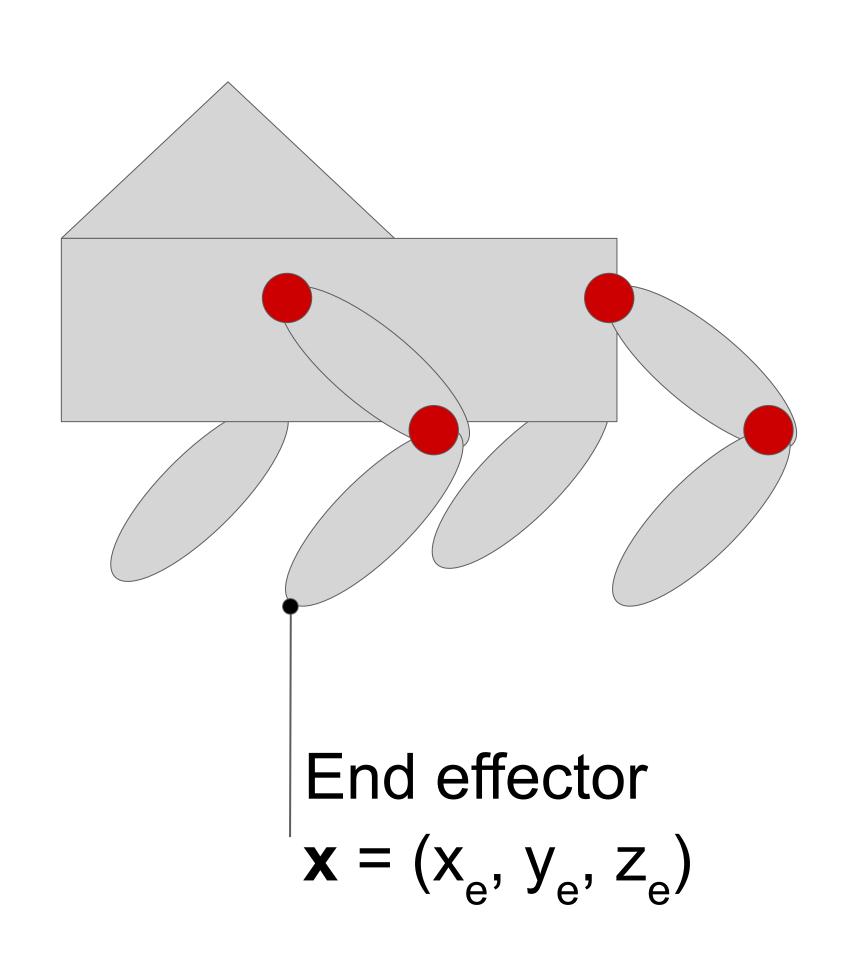
Pose: q = [x, y, z, ...]



Pose: q = [x, y, z, r, p, y, ...]

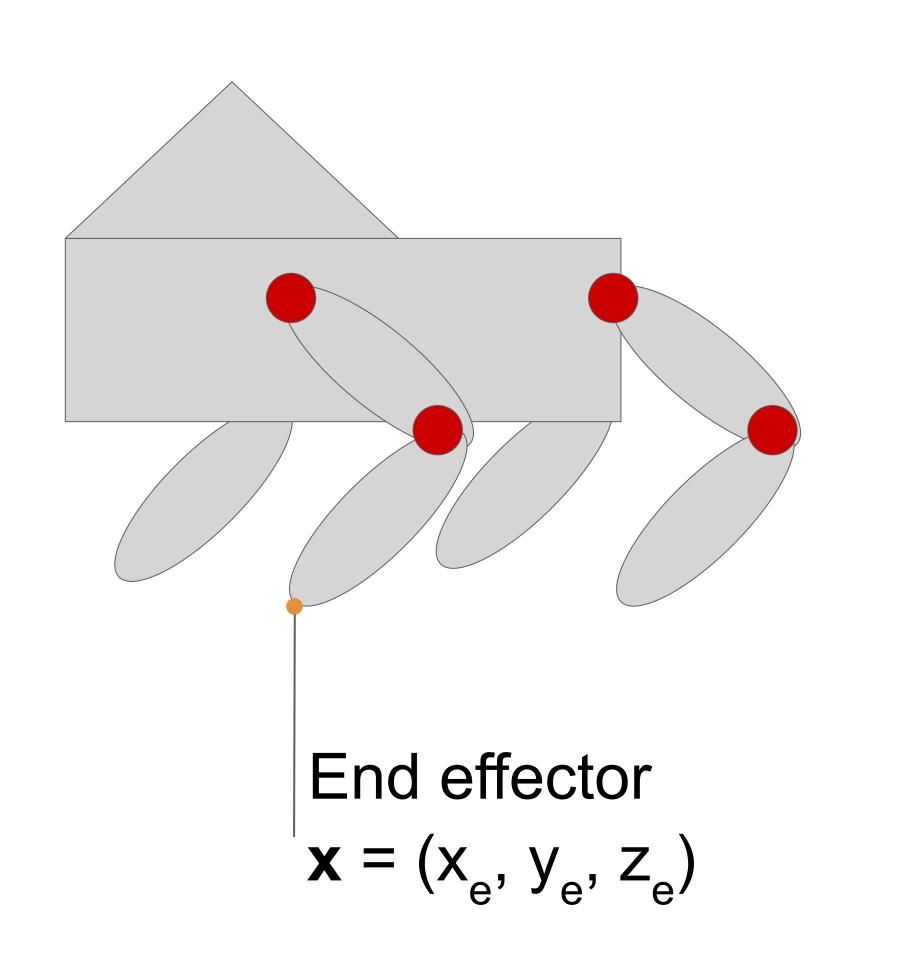


Pose:  $\mathbf{q} = [x, y, z, r, p, y, \theta_1, ..., \theta_{12}]$ 



Pose: q

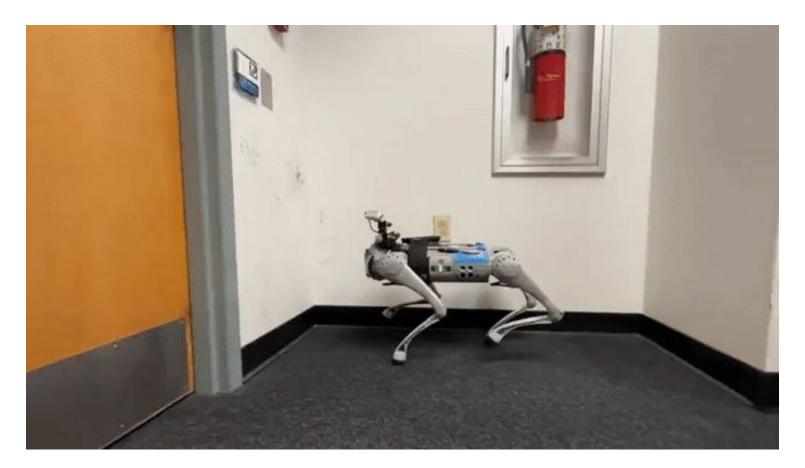
Position:  $\mathbf{x} = (x_e, y_e, z_e)$ 



$$x = FK(q)$$

$$q = IK(x)$$

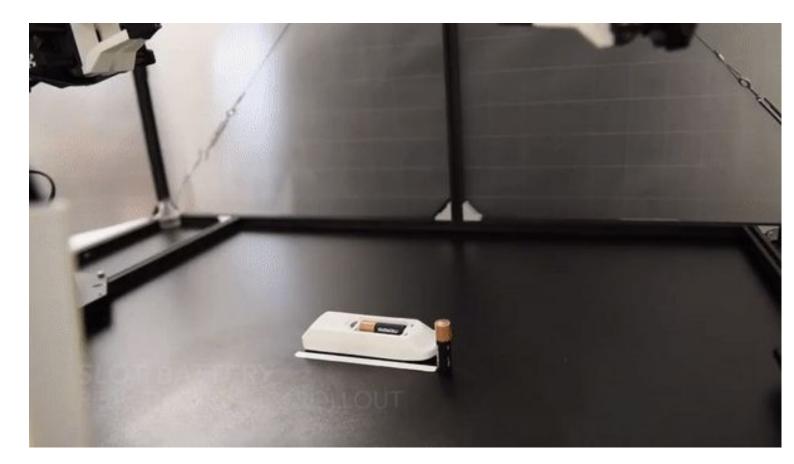
# Why Forward Kinematics?



<u>Legs as Manipulator: Pushing Quadrupedal Agility Beyond Locomotion,</u> Cheng et al. ICRA 2023

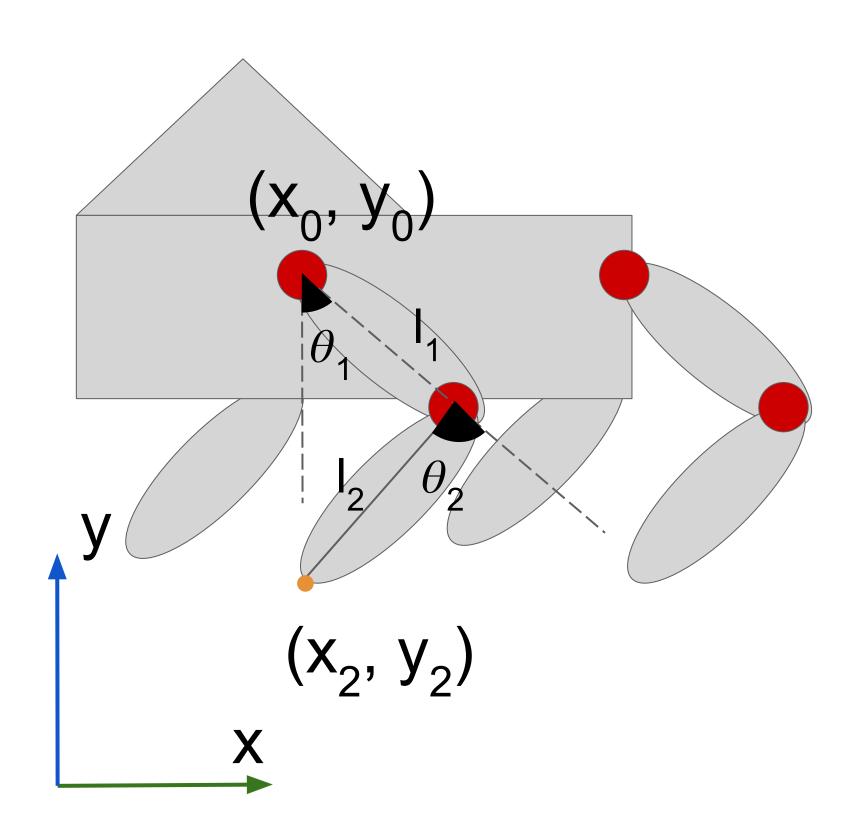


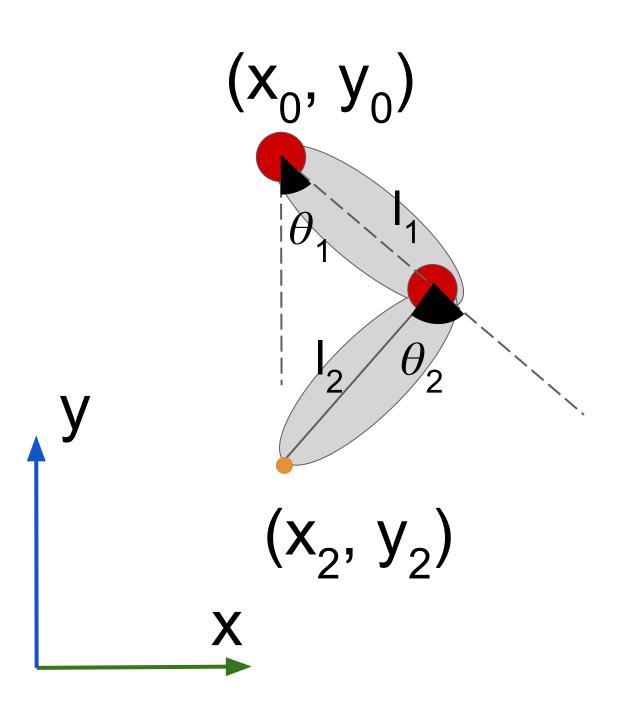
Learning Agile Soccer Skills for a Bipedal Robot with Deep Reinforcement Learning, Haarnoja et al. 2023

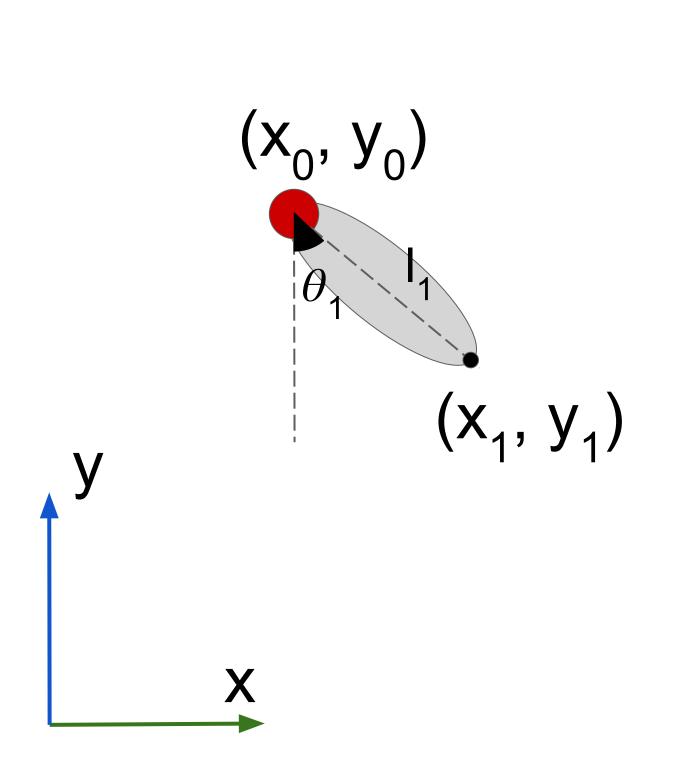


<u>Learning Fine-Grained Bimanual Manipulation with Low-Cost Hardware</u>, Zhao et al. RSS 2023

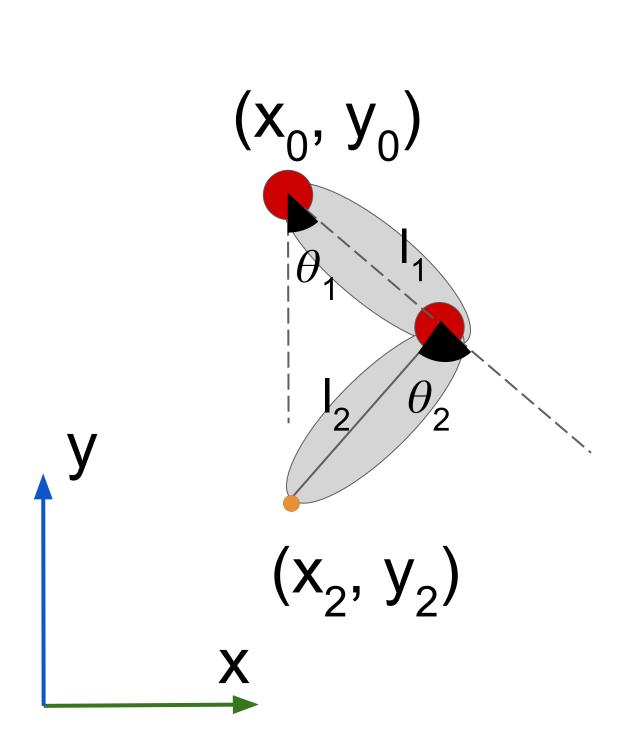
- Knowing end effector positions are critical for robotic tasks
- Onboard sensors only provide (motor) joint angles





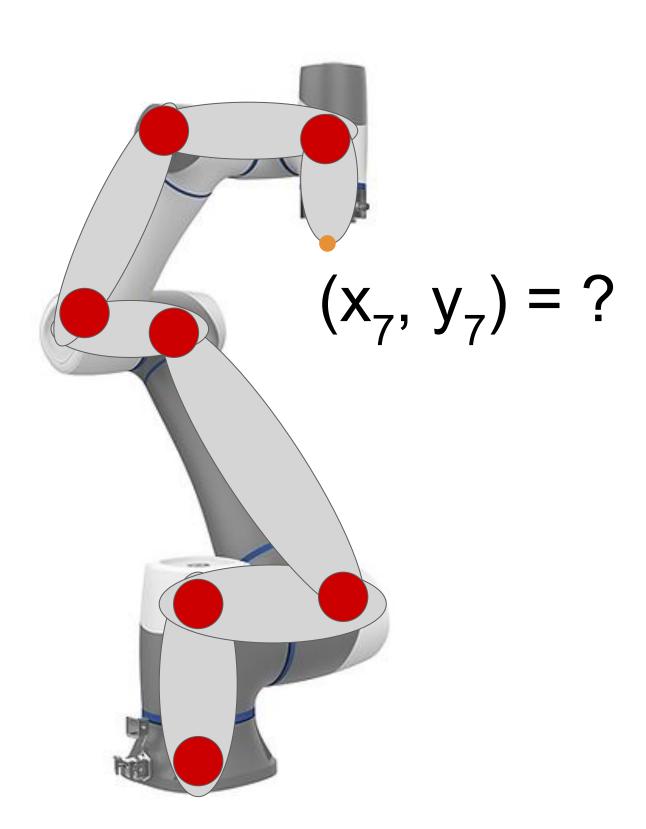


$$x_1=l_1\sin{( heta_1)}+x_0$$
  $y_1=-l_1\cos( heta_1)+y_0$ 

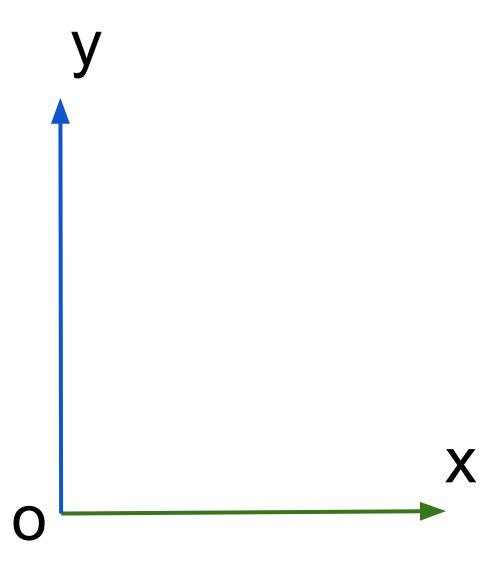


$$egin{aligned} x_1 &= l_1 \sin{( heta_1)} + x_0 \ y_1 &= -l_1 \cos( heta_1) + y_0 \ x_2 &= x_1 - l_2 \sin{( heta_2 - heta_1)} = l_1 \sin{( heta_1)} - l_2 \sin{( heta_2 - heta_1)} + x_0 \ y_2 &= y_1 - l_2 \cos{( heta_2 - heta_1)} = -l_1 \cos{( heta_1)} - l_2 \cos{( heta_2 - heta_1)} + y_0 \end{aligned}$$

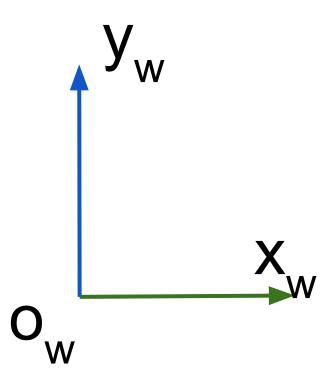
# A Complex Example



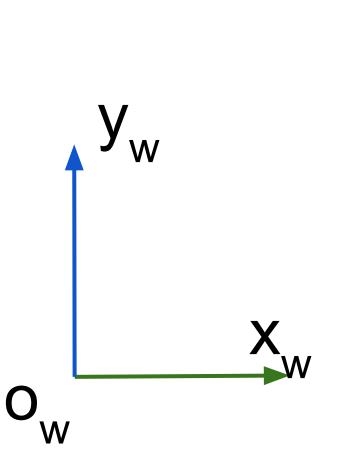
Coordinate system: Origin and Axes

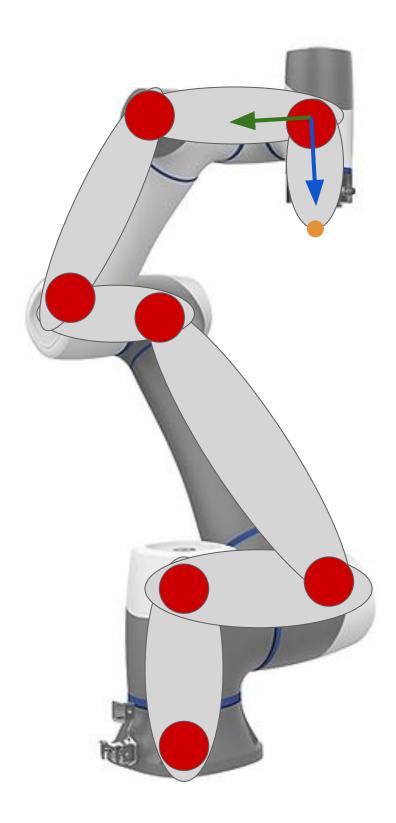


World coordinate: An absolute coordinate system that is fixed in space

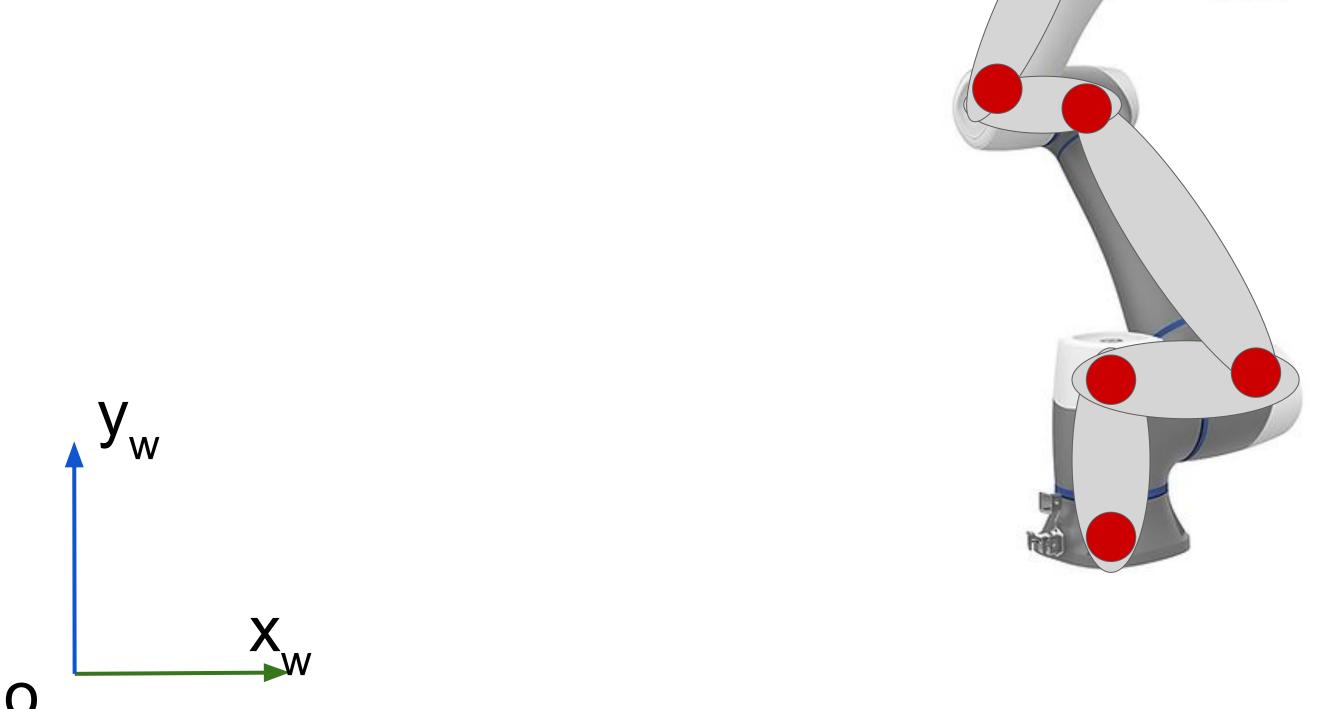


Local coordinate: A coordinate system that is attached to a robot link

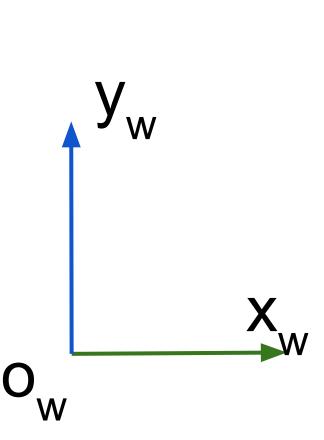


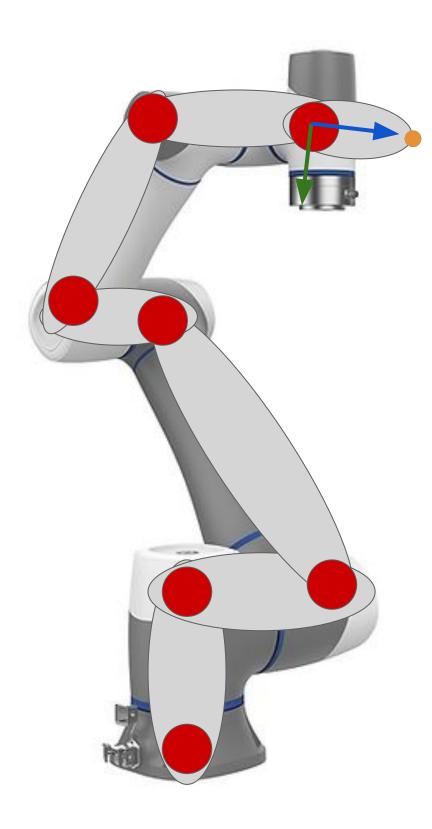


Local coordinate: A coordinate system that is attached to a robot link

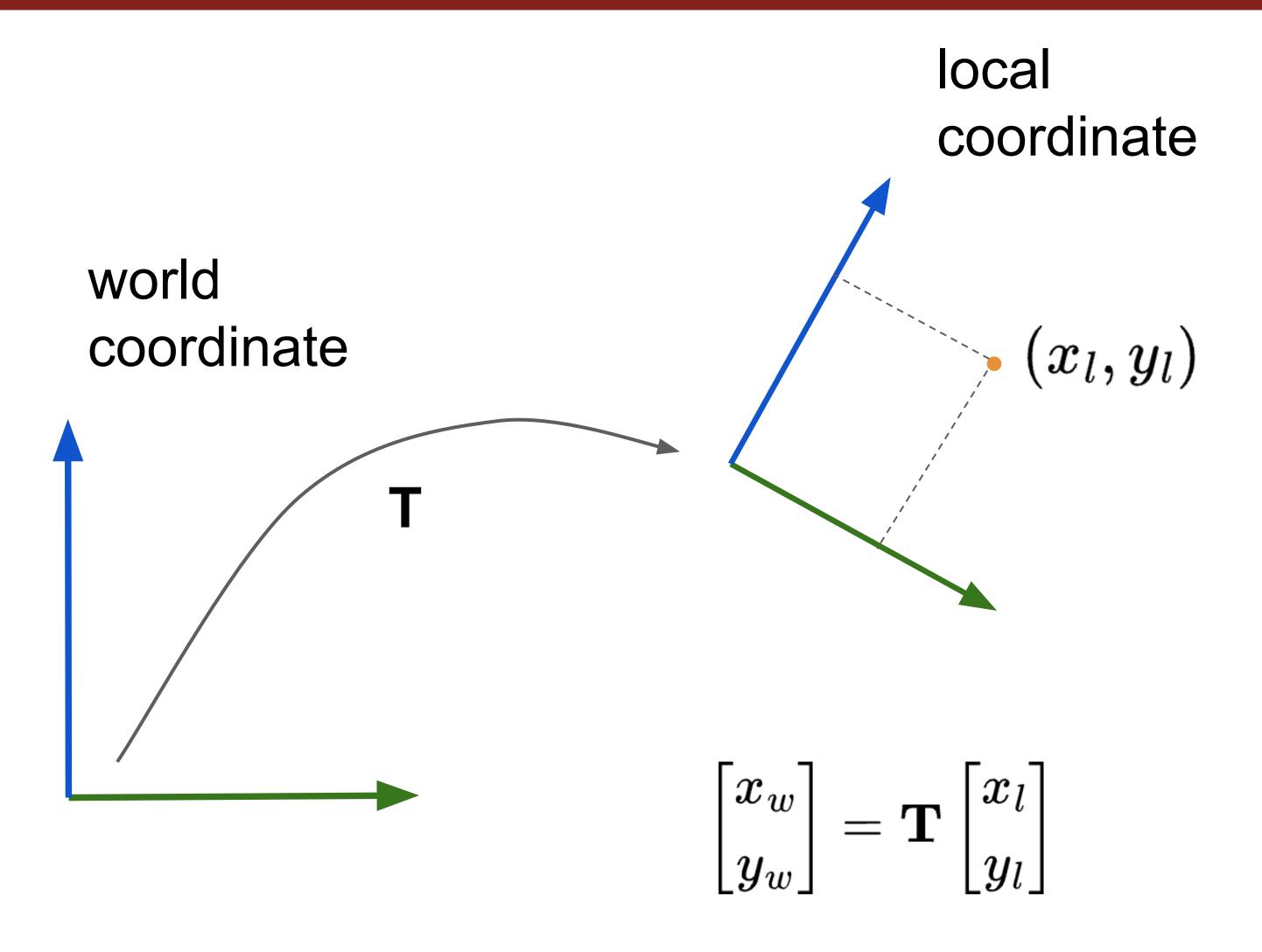


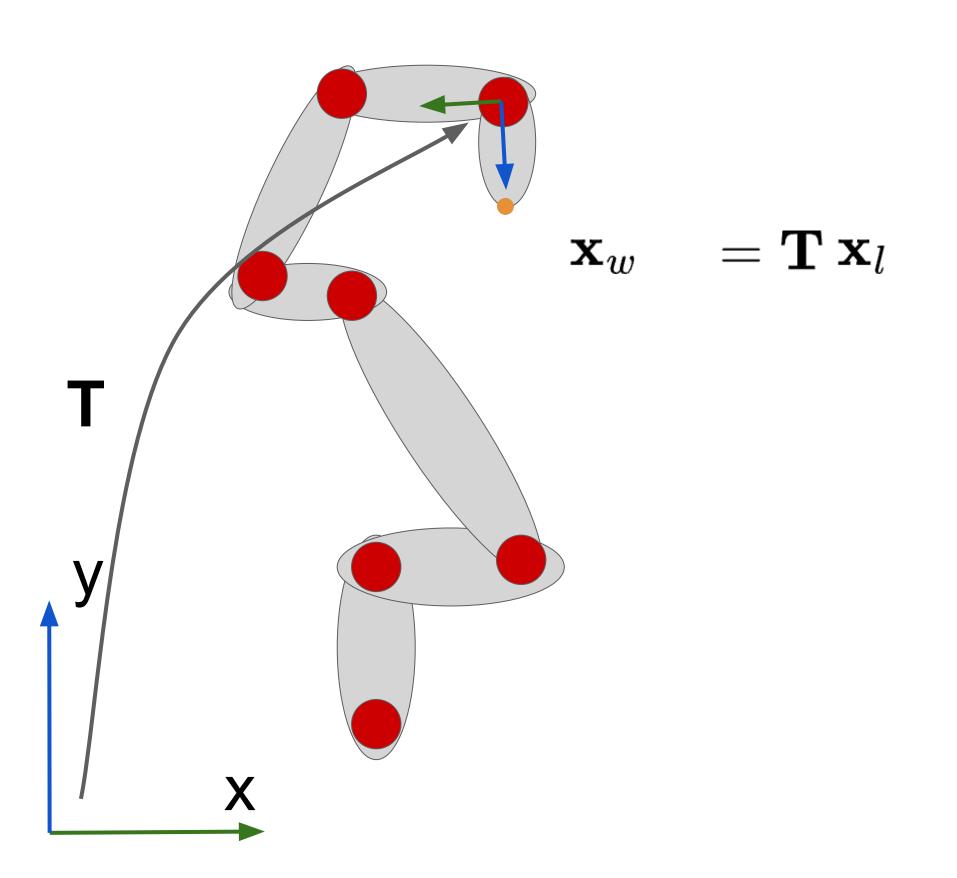
Quiz: Does the end-effector coordinate change in local vs. world coordinate?

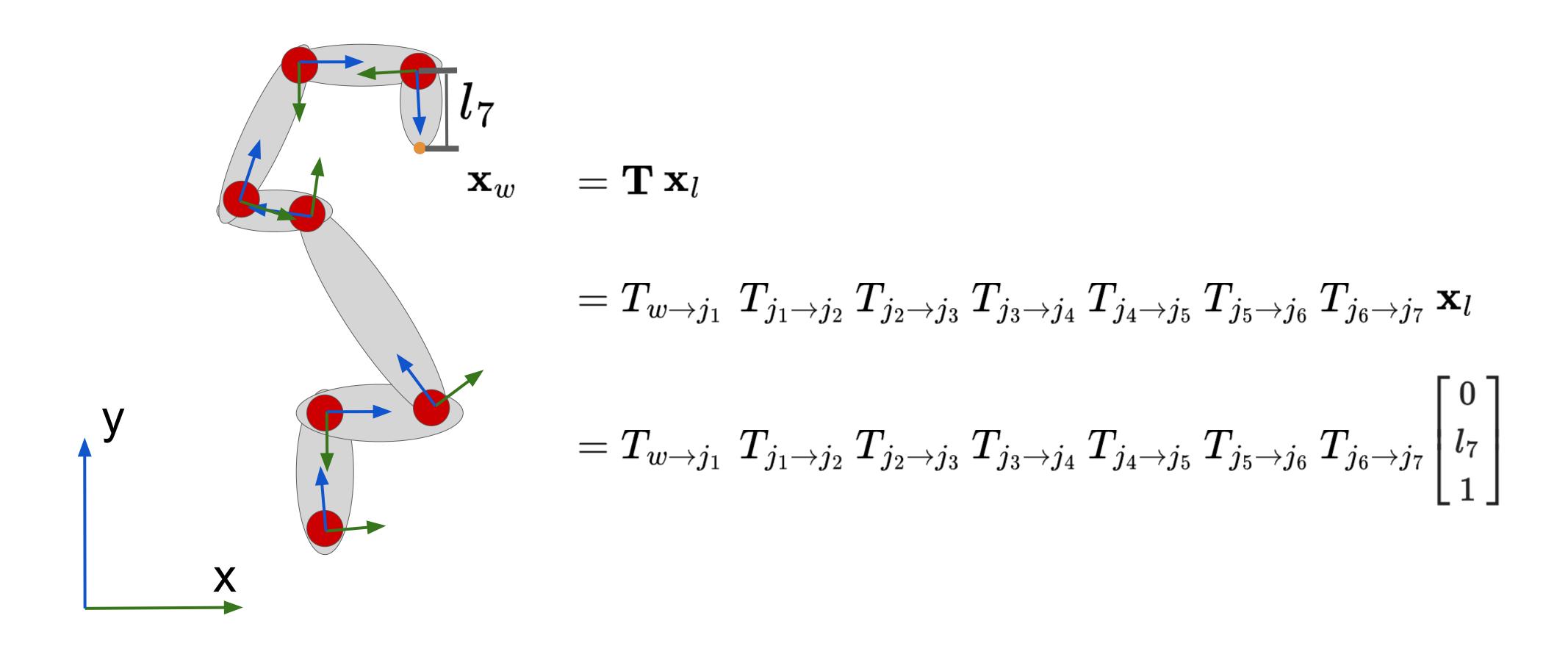




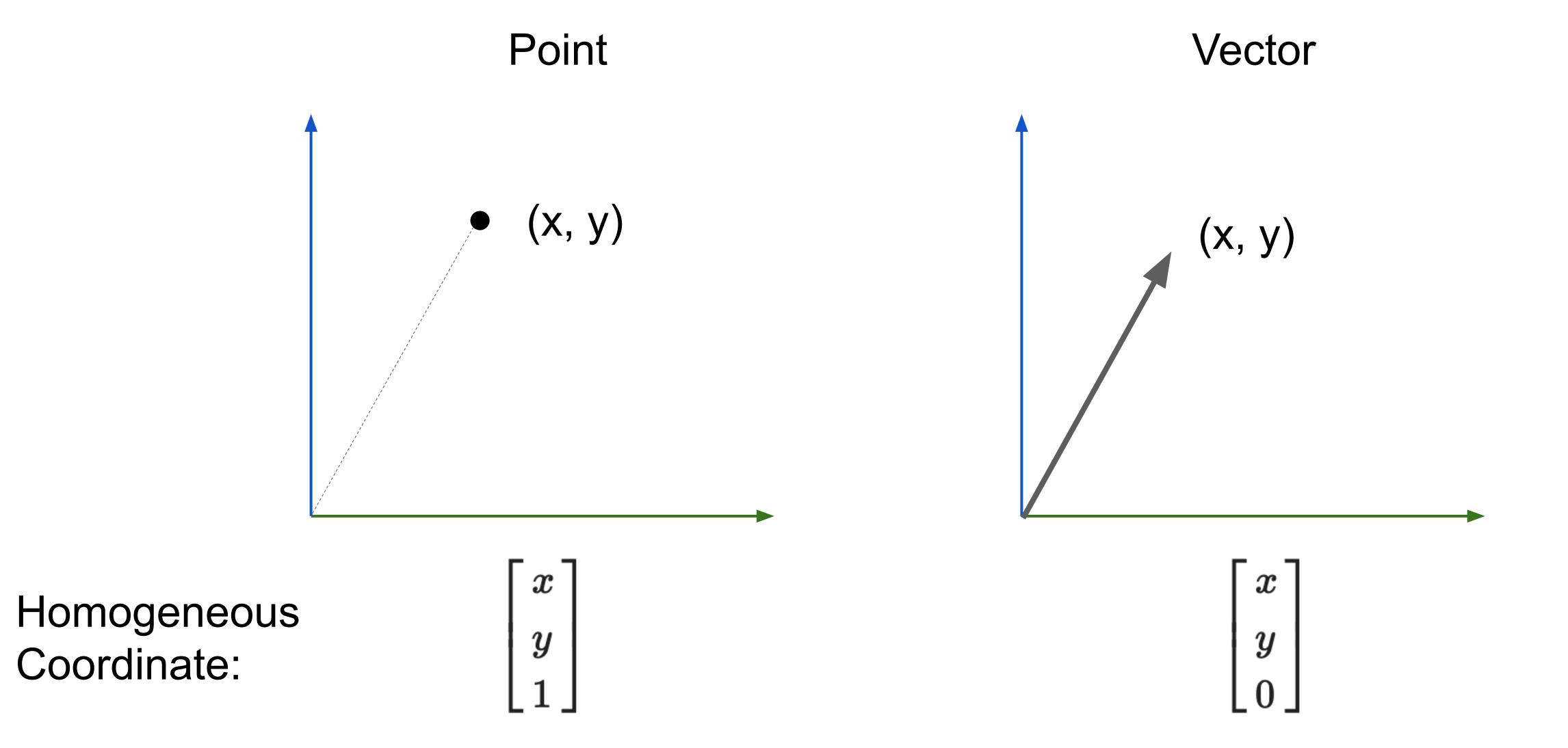
# Transformation between Coordinate Systems



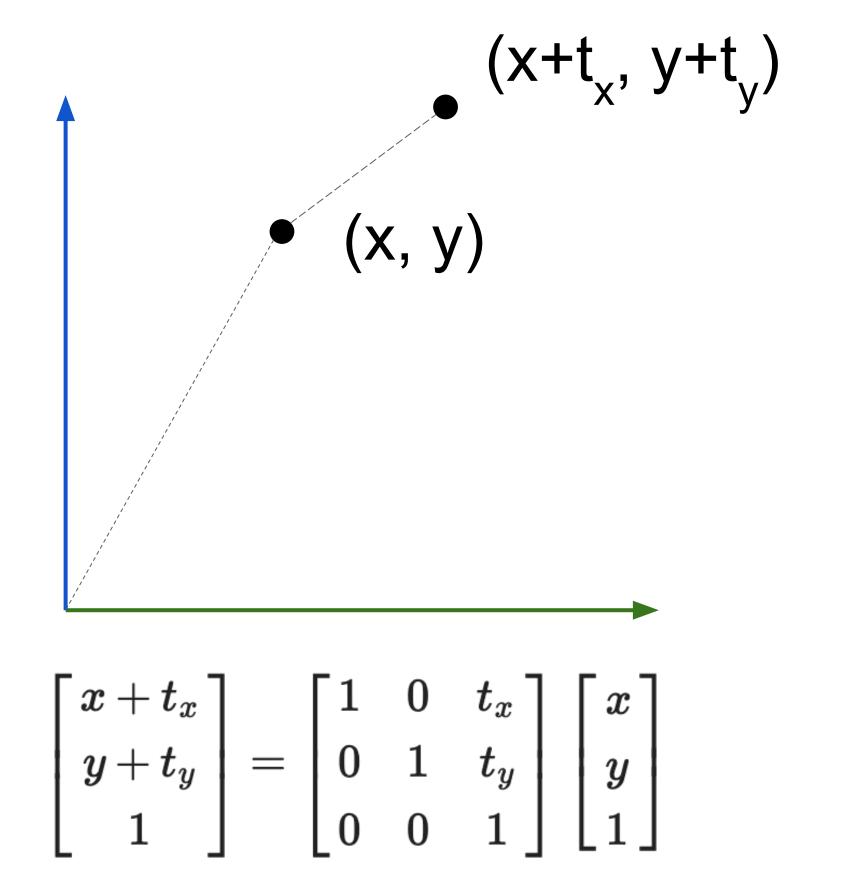


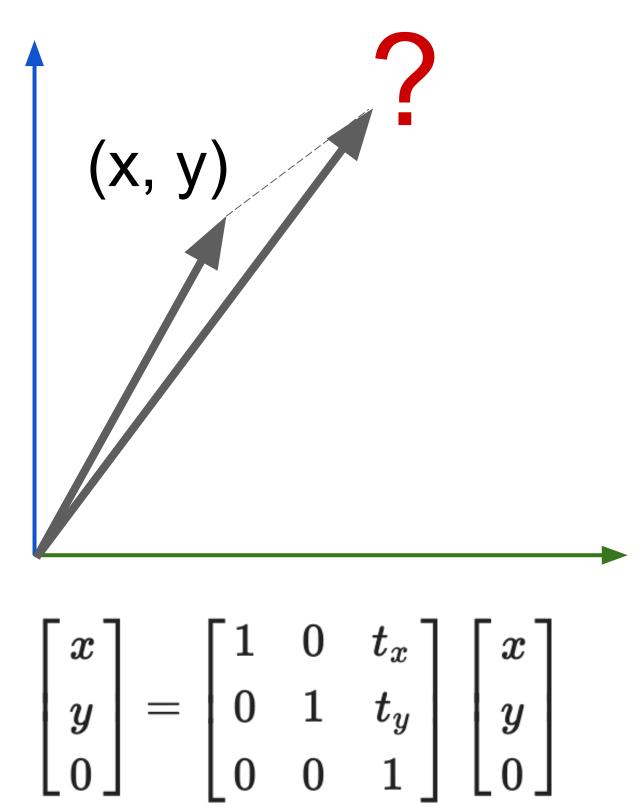


### Homogeneous Coordinate



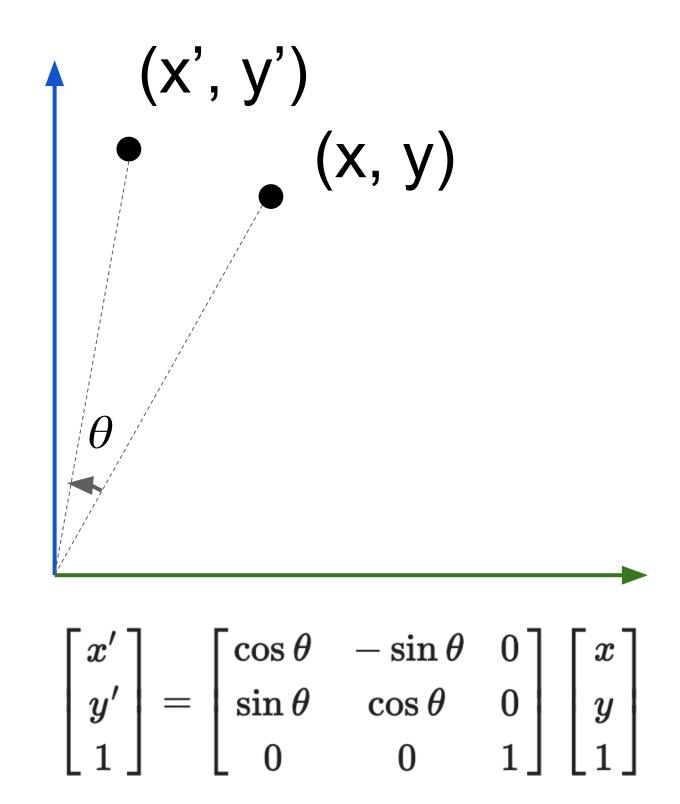
#### **Translation Matrix**



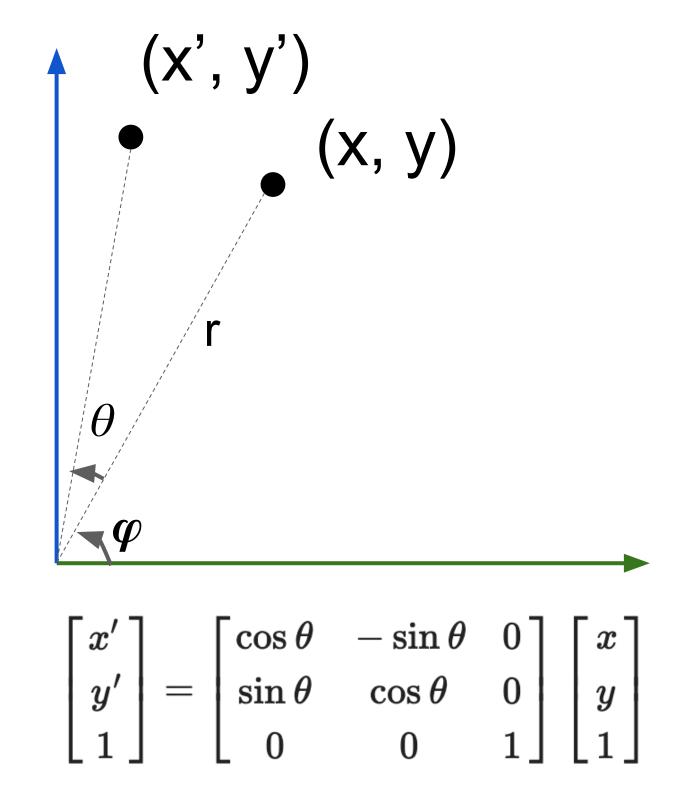


$$egin{bmatrix} x \ y \ 0 \end{bmatrix} = egin{bmatrix} 1 & 0 & t_x \ 0 & 1 & t_y \ 0 & 0 & 1 \end{bmatrix} egin{bmatrix} x \ y \ 0 \end{bmatrix}$$

#### **Rotational Matrix**

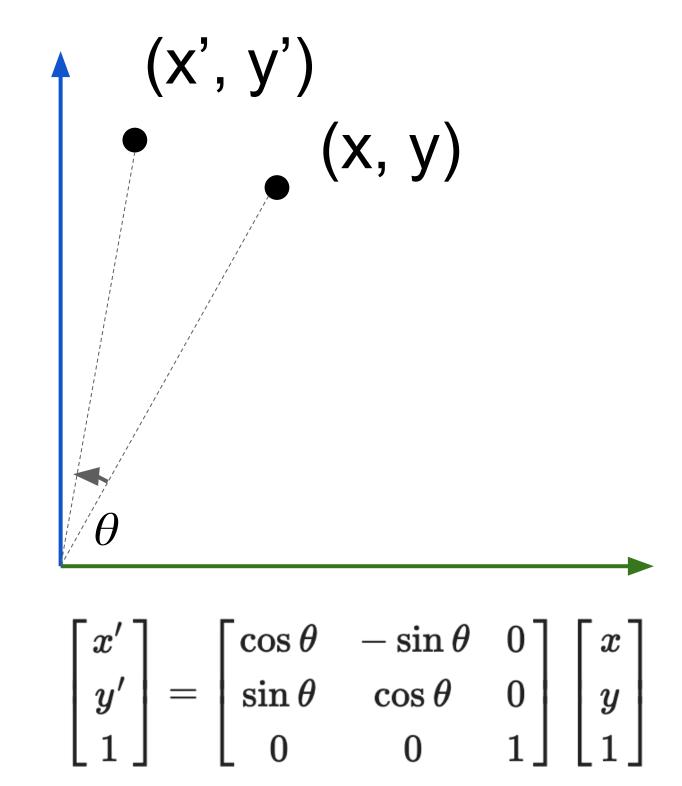


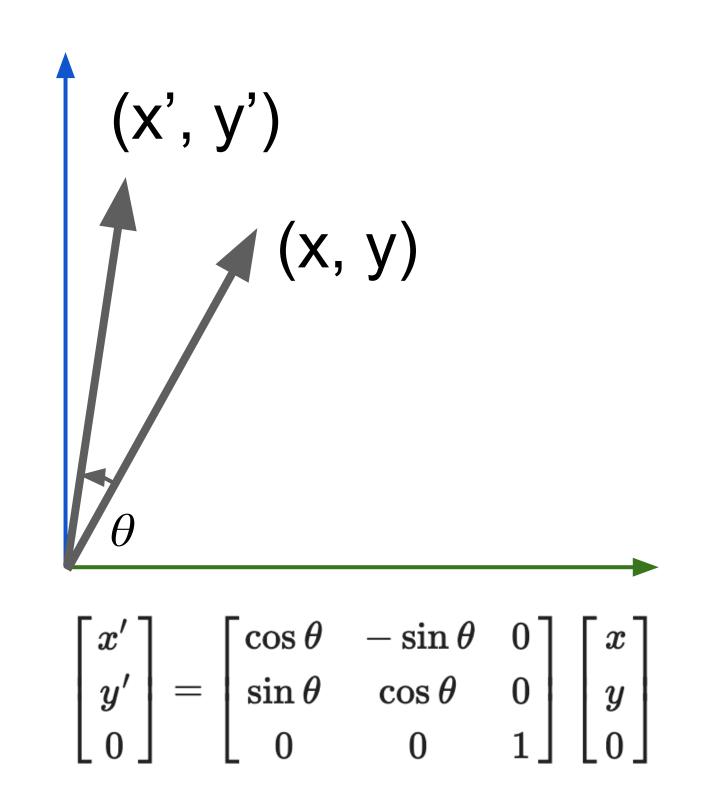
#### **Rotational Matrix**



$$egin{aligned} & \underline{x} = r\cos\left(\phi\right) \ & \underline{y} = r\sin\left(\phi\right) \ & x' = r\cos\left(\phi + \theta\right) \ & = r\cos\left(\phi\right)\cos\left(\theta\right) - r\sin\left(\phi\right)\sin\left(\theta\right) \ & = x\cos(\theta) - y\sin(\theta) \ & = x\sin\left(\phi + \theta\right) \ & = r\sin\left(\phi\right)\cos\left(\theta\right) + r\cos\left(\phi\right)\sin\left(\theta\right) \ & = x\sin(\theta) + y\cos(\theta) \end{aligned}$$

#### **Rotational Matrix**



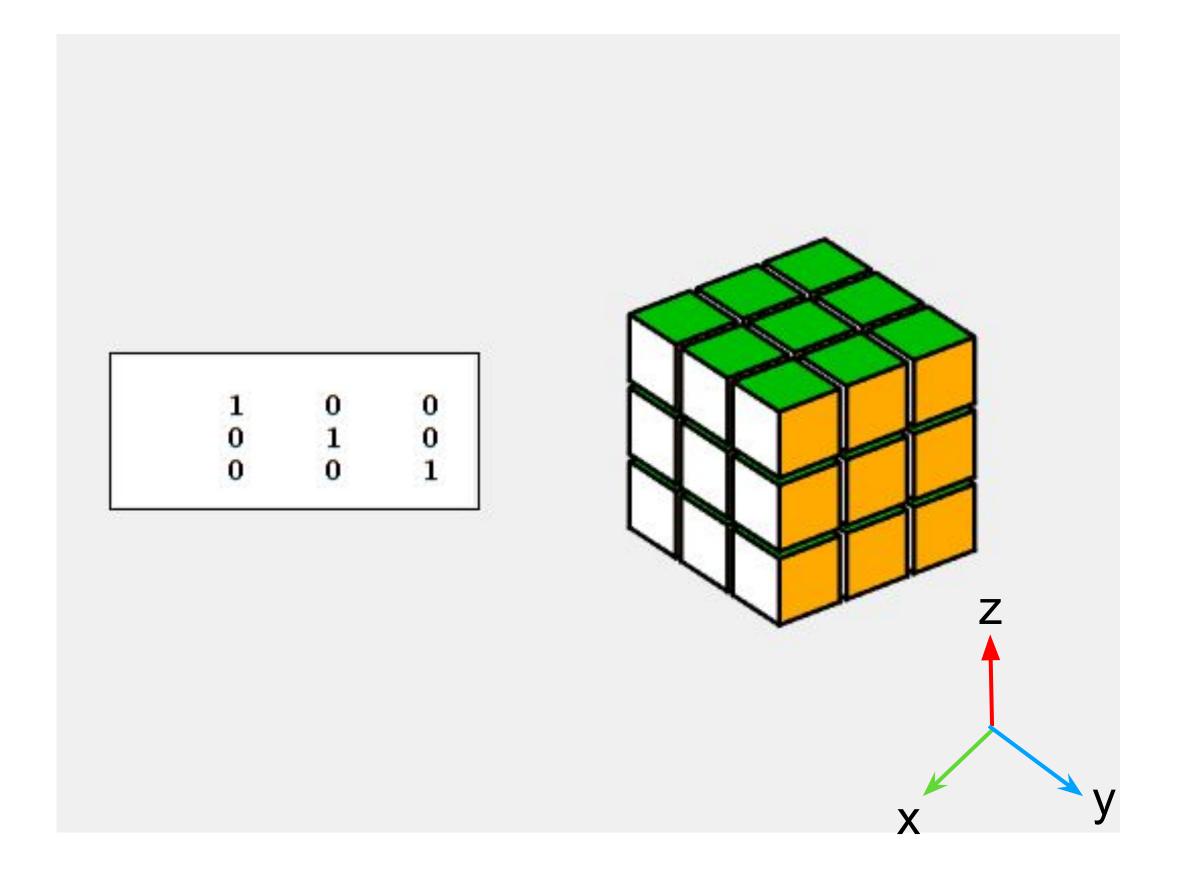


#### Rotational Matrix in 3D

$$Rot_{x}(\theta_{x}) = \begin{pmatrix}
1 & 0 & 0 & 0 \\
0 & \cos \theta_{x} & -\sin \theta_{x} & 0 \\
0 & \sin \theta_{x} & \cos \theta_{x} & 0
\end{pmatrix}$$

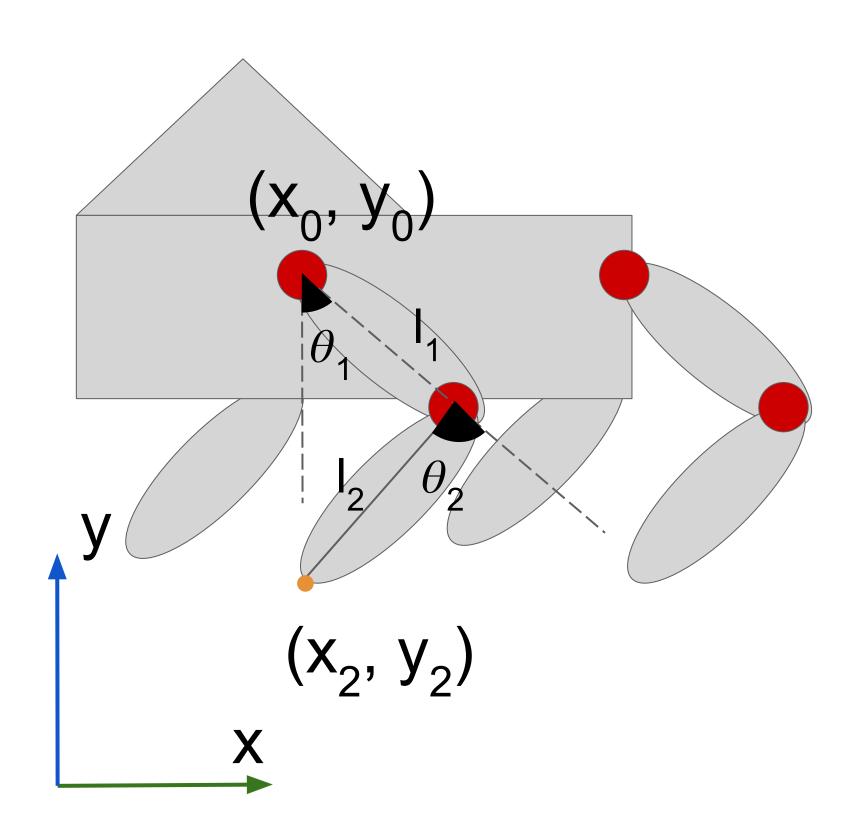
$$Rot_{y}(\theta_{y}) = \begin{pmatrix}
\cos \theta_{y} & 0 & \sin \theta_{y} & 0 \\
0 & 1 & 0 & 0 \\
-\sin \theta_{y} & 0 & \cos \theta_{y} & 0
\end{pmatrix}$$

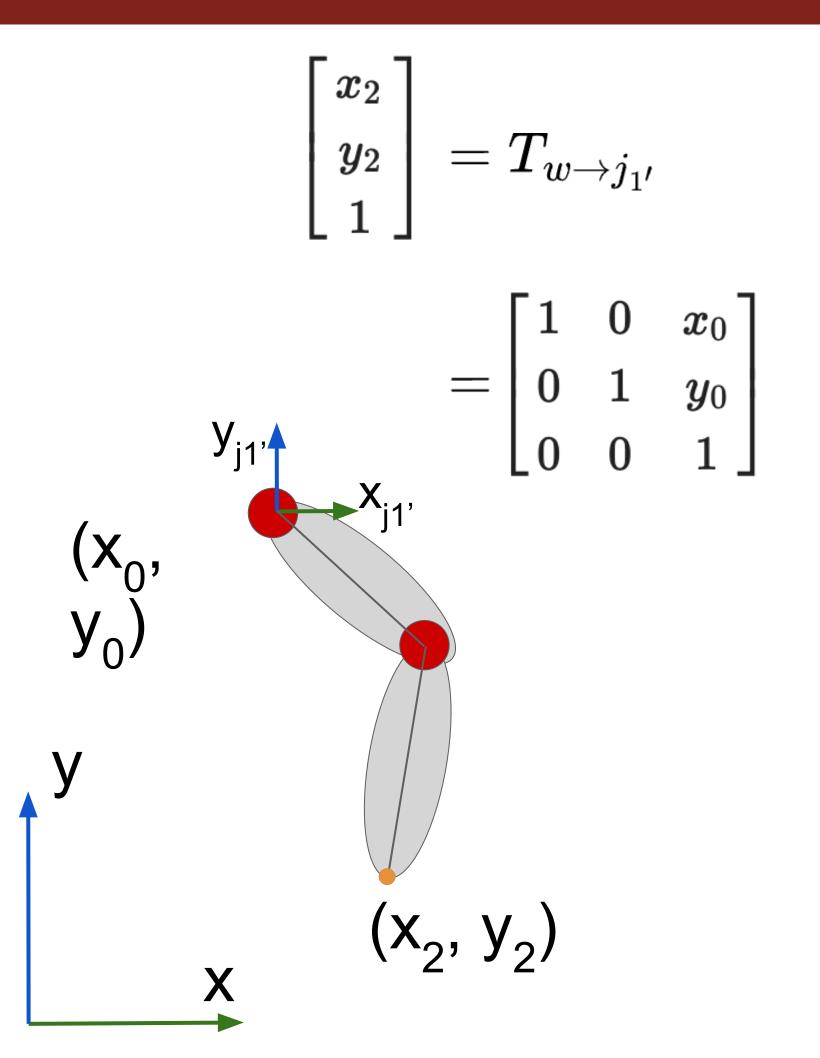
$$Rot_{z}(\theta_{z}) = \begin{pmatrix}
\cos \theta_{z} & -\sin \theta_{z} & 0 & 0 \\
\sin \theta_{z} & \cos \theta_{z} & 0 & 0 \\
0 & 0 & 1 & 0
\end{pmatrix}$$



# Quiz

$$T_1 T_2 == T_2 T_1$$
?

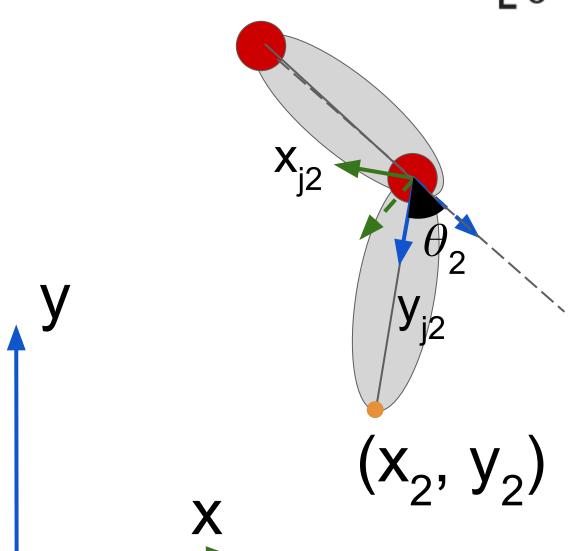




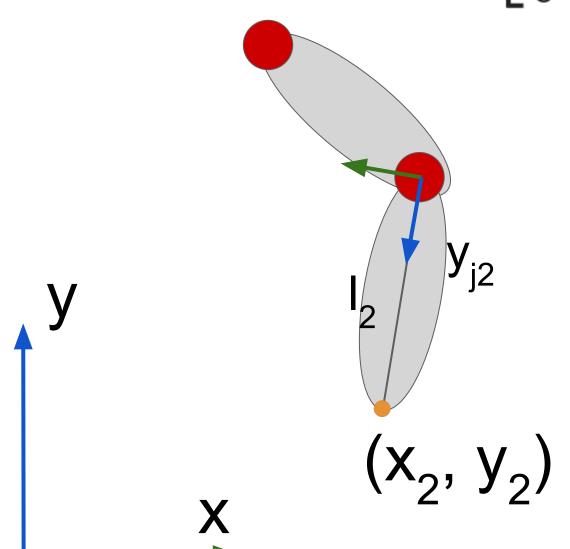
$$\begin{bmatrix} x_2 \\ y_2 \\ 1 \end{bmatrix} = T_{w \to j_1'} T_{j_1' \to j_1}$$
 
$$= \begin{bmatrix} 1 & 0 & x_0 \\ 0 & 1 & y_0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} \cos(\pi + \theta_1) & -\sin(\pi + \theta_1) & 0 \\ \sin(\pi + \theta_1) & \cos(\pi + \theta_1) & 0 \\ 0 & 0 & 1 \end{bmatrix}$$
 
$$\mathbf{x}_{\mathbf{j}1}$$
 
$$\mathbf{x}_{\mathbf{j}1}$$
 
$$\mathbf{y}$$
 
$$(\mathbf{x}_2, \mathbf{y}_2)$$

$$\begin{bmatrix} x_2 \\ y_2 \\ 1 \end{bmatrix} = T_{w \to j_{1'}} T_{j_{1'} \to j_1} T_{j_1 \to j_{2'}}$$
 
$$(\mathsf{X}_0, \mathsf{y}_0) = \begin{bmatrix} 1 & 0 & x_0 \\ 0 & 1 & y_0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} \cos(\pi + \theta_1) & -\sin(\pi + \theta_1) & 0 \\ \sin(\pi + \theta_1) & \cos(\pi + \theta_1) & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & l_1 \\ 0 & 0 & 1 \end{bmatrix}$$
 
$$\mathsf{y}_{j_{2'}}$$
 
$$\mathsf{y}_{j_{2'}}$$

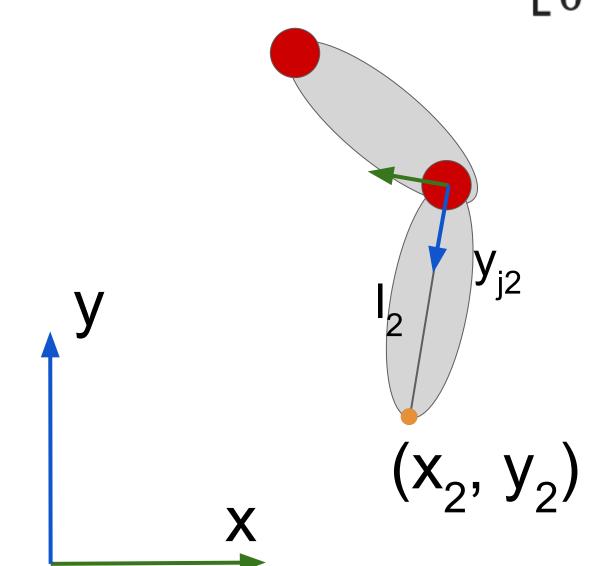
$$egin{bmatrix} x_2 \ y_2 \ 1 \end{bmatrix} = T_{w o j_1'} T_{j_1' o j_1} T_{j_1 o j_2'} T_{j_2' o j_2} \ = egin{bmatrix} 1 & 0 & x_0 \ 0 & 1 & y_0 \ 0 & 0 & 1 \end{bmatrix} egin{bmatrix} \cos(\pi+ heta_1) & -\sin(\pi+ heta_1) & 0 \ \sin(\pi+ heta_1) & \cos(\pi+ heta_1) & 0 \ 0 & 0 & 1 \end{bmatrix} egin{bmatrix} 1 & 0 & 0 \ 0 & 1 & l_1 \ 0 & 0 & 1 \end{bmatrix} egin{bmatrix} \cos(- heta_2) & -\sin(- heta_2) & 0 \ \sin(- heta_2) & \cos(- heta_2) & 0 \ 0 & 0 & 1 \end{bmatrix}$$



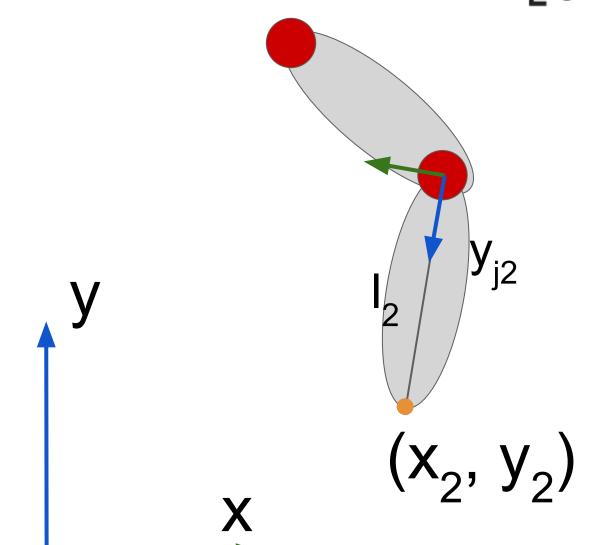
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$$egin{bmatrix} x_2 \ y_2 \ 1 \end{bmatrix} = T_{w o j_1'} T_{j_1' o j_1} T_{j_1 o j_2'} T_{j_2' o j_2} egin{bmatrix} 0 \ l_2 \ 1 \end{bmatrix} \ = egin{bmatrix} 1 & 0 & x_0 \ 0 & 1 & y_0 \ 0 & 0 & 1 \end{bmatrix} egin{bmatrix} \cos(\pi+ heta_1) & -\sin(\pi+ heta_1) & 0 \ \sin(\pi+ heta_1) & \cos(\pi+ heta_1) & 0 \ 0 & 0 & 1 \end{bmatrix} egin{bmatrix} 1 & 0 & 0 \ 0 & 1 & l_1 \ 0 & 0 & 1 \end{bmatrix} egin{bmatrix} \cos(- heta_2) & -\sin(- heta_2) & 0 \ \sin(- heta_2) & \cos(- heta_2) & 0 \ 0 & 1 \end{bmatrix} egin{bmatrix} 0 \ l_2 \ 1 \end{bmatrix}$$



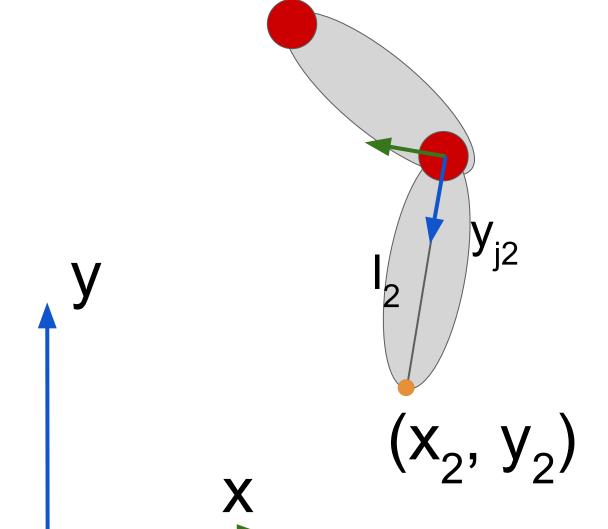
$$=egin{bmatrix} -l_2\cos heta_1\sin heta_2+l_2\sin heta_1\cos heta_2+l_1\sin heta_1+x_0\ -l_2\sin heta_1\sin heta_2-l_2\cos heta_1\cos heta_2-l_1\cos heta_1+y_0\ 1 \end{bmatrix}$$



$$=egin{bmatrix} -l_2\cos heta_1\sin heta_2+l_2\sin heta_1\cos heta_2+l_1\sin heta_1+x_0\ -l_2\sin heta_1\sin heta_2-l_2\cos heta_1\cos heta_2-l_1\cos heta_1+y_0\ 1 \end{bmatrix}$$

$$egin{aligned} iggridge -l_2 \sin( heta_2 - heta_1) + l_1 \sin heta_1 + x_0 \ -l_2 \cos( heta_2 - heta_1) - l_1 \cos heta_1 + y_0 \ 1 \end{aligned}$$

$$egin{bmatrix} x_2 \ y_2 \ 1 \end{bmatrix} = T_{w o j_1'} T_{j_1' o j_1} T_{j_1 o j_2'} T_{j_2' o j_2} egin{bmatrix} 0 \ l_2 \ 1 \end{bmatrix} \ = egin{bmatrix} 1 & 0 & x_0 \ 0 & 1 & y_0 \ 0 & 0 & 1 \end{bmatrix} egin{bmatrix} \cos(\pi+ heta_1) & -\sin(\pi+ heta_1) & 0 \ \sin(\pi+ heta_1) & \cos(\pi+ heta_1) & 0 \ 0 & 0 & 1 \end{bmatrix} egin{bmatrix} 1 & 0 & 0 \ 0 & 1 & l_1 \ 0 & 0 & 1 \end{bmatrix} egin{bmatrix} \cos(- heta_2) & -\sin(- heta_2) & 0 \ \sin(- heta_2) & \cos(- heta_2) & 0 \ 0 & 1 \end{bmatrix} egin{bmatrix} 0 \ l_2 \ 1 \end{bmatrix}$$

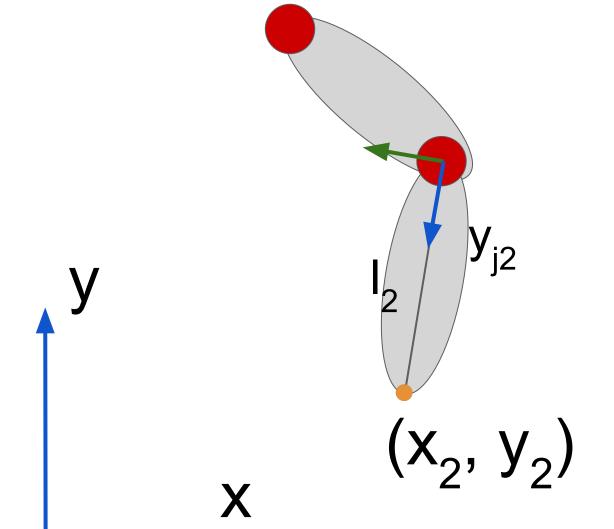


$$=egin{bmatrix} -l_2\cos heta_1\sin heta_2+l_2\sin heta_1\cos heta_2+l_1\sin heta_1+x_0\ -l_2\sin heta_1\sin heta_2-l_2\cos heta_1\cos heta_2-l_1\cos heta_1+y_0\ 1 \end{bmatrix}$$

$$=egin{bmatrix} -l_2\sin( heta_2- heta_1)+l_1\sin heta_1+x_0\ -l_2\cos( heta_2- heta_1)-l_1\cos heta_1+y_0\ \end{pmatrix}$$
 , because

$$\sin( heta_2- heta_1)=\sin heta_2\cos heta_1-\cos heta_2\sin heta_1 \ \cos( heta_2- heta_1)=\cos heta_2\cos heta_1+\sin heta_2\sin heta_1$$

$$egin{bmatrix} x_2 \ y_2 \ 1 \end{bmatrix} = T_{w o j_1'} T_{j_1' o j_1} T_{j_1 o j_2'} T_{j_2' o j_2} egin{bmatrix} 0 \ l_2 \ 1 \end{bmatrix} \ = egin{bmatrix} 1 & 0 & x_0 \ 0 & 1 & y_0 \ 0 & 0 & 1 \end{bmatrix} egin{bmatrix} \cos(\pi+ heta_1) & -\sin(\pi+ heta_1) & 0 \ \sin(\pi+ heta_1) & \cos(\pi+ heta_1) & 0 \ 0 & 0 & 1 \end{bmatrix} egin{bmatrix} 1 & 0 & 0 \ 0 & 1 & l_1 \ 0 & 0 & 1 \end{bmatrix} egin{bmatrix} \cos(- heta_2) & -\sin(- heta_2) & 0 \ \sin(- heta_2) & \cos(- heta_2) & 0 \ 0 & 1 \end{bmatrix} egin{bmatrix} 0 \ l_2 \ 1 \end{bmatrix}$$

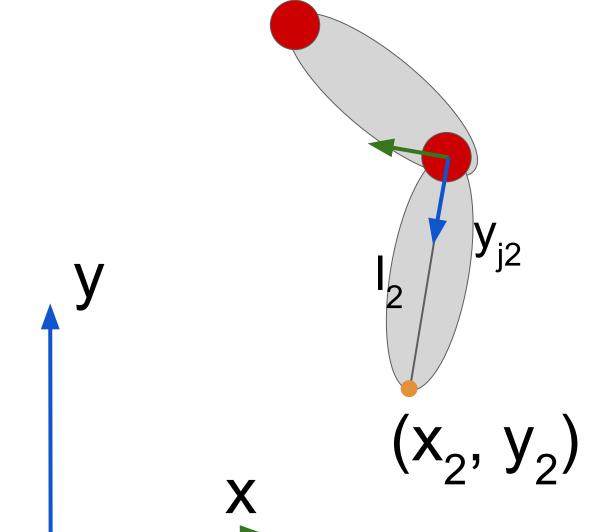


$$= \left[ egin{array}{c} rac{-l_2\cos heta_1\sin heta_2+l_2\sin heta_1\cos heta_2}{-l_2\sin heta_1\sin heta_2-l_2\cos heta_1\cos heta_2} + l_1\sin heta_1+x_0 \ rac{-l_2\sin heta_1\sin heta_2-l_2\cos heta_1\cos heta_2}{1} - l_1\cos heta_1+y_0 \ \end{array} 
ight]$$

$$=egin{bmatrix} -l_2\sin( heta_2- heta_1)+l_1\sin heta_1+x_0\ -l_2\cos( heta_2- heta_1)-l_1\cos heta_1+y_0\ \end{pmatrix}$$
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$$egin{bmatrix} x_2 \ y_2 \ 1 \end{bmatrix} = T_{w o j_1'} T_{j_1' o j_2} T_{j_2' o j_2} egin{bmatrix} 0 \ l_2 \ 1 \end{bmatrix} \ = egin{bmatrix} 1 & 0 & x_0 \ 0 & 1 & y_0 \ 0 & 0 & 1 \end{bmatrix} egin{bmatrix} \cos(\pi+ heta_1) & -\sin(\pi+ heta_1) & 0 \ \sin(\pi+ heta_1) & \cos(\pi+ heta_1) & 0 \ 0 & 0 & 1 \end{bmatrix} egin{bmatrix} 1 & 0 & 0 \ 0 & 1 & l_1 \ 0 & 0 & 1 \end{bmatrix} egin{bmatrix} \cos(- heta_2) & -\sin(- heta_2) & 0 \ \sin(- heta_2) & \cos(- heta_2) & 0 \ 0 & 1 \end{bmatrix} egin{bmatrix} 0 \ l_2 \ 1 \end{bmatrix}$$



$$= egin{bmatrix} -l_2\cos heta_1\sin heta_2 + l_2\sin heta_1\cos heta_2 + l_1\sin heta_1 + x_0 \ -l_2\sin heta_1\sin heta_2 - l_2\cos heta_1\cos heta_2 - l_1\cos heta_1 + y_0 \ 1 \end{bmatrix}$$

$$=egin{bmatrix} -l_2\sin( heta_2- heta_1)+l_1\sin heta_1+x_0\ -l_2\cos( heta_2- heta_1)-l_1\cos heta_1+y_0 \end{bmatrix}$$
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# Quiz

Is FK a linear transformation?

#### Pseudo-code

```
Function FK2D(1[], theta[], x, y):
  // Input:
  // l[]: Array of body length
  // theta[]: Array of joint angles
  // x, y: The offset of 1st joint in the world coordinate
  // Output:
  // pos: position of the end effector
  T = TranslationMatrix(x, y) * RotationMatrix(theta[0])
  for i = 1 to n-1:
     Trans = TranslationMatrix(0, 1[i - 1])
     Rot = RotationMatrix(theta[i])
     T = T * Trans * Rot
  pos = T * (0, 1[n-1], 1)
  return pos[0:2]
```

# Considerations about Speed

$$\mathbf{x}_w = \mathbf{T}_1 \mathbf{R}_1 \dots \mathbf{T}_n \mathbf{R}_n \mathbf{x}_l$$

Time complexity?

### Considerations about Speed

$$\mathbf{x}_w = \mathbf{T}_1 \mathbf{R}_1 \dots \mathbf{T}_n \mathbf{R}_n \mathbf{x}_l$$

Time complexity?

Affine transformation: combine translation and rotation

$$\mathbf{A} = \mathbf{T}(x,y) * \mathbf{R}( heta) = egin{bmatrix} 1 & 0 & x \ 0 & 1 & y \ 0 & 0 & 1 \end{bmatrix} egin{bmatrix} \cos heta & -\sin heta & 0 \ \sin heta & \cos heta & 0 \ 0 & 0 & 1 \end{bmatrix} = egin{bmatrix} \cos heta & -\sin heta & x \ \sin heta & \cos heta & y \ 0 & 0 & 1 \end{bmatrix}$$

$$\mathbf{x}_w = \mathbf{A}_1 \dots \mathbf{A}_n \mathbf{x}_l$$

# Considerations about Speed

$$\mathbf{x}_w = \mathbf{T}_1 \mathbf{R}_1 \dots \mathbf{T}_n \mathbf{R}_n \mathbf{x}_l$$

Time complexity?

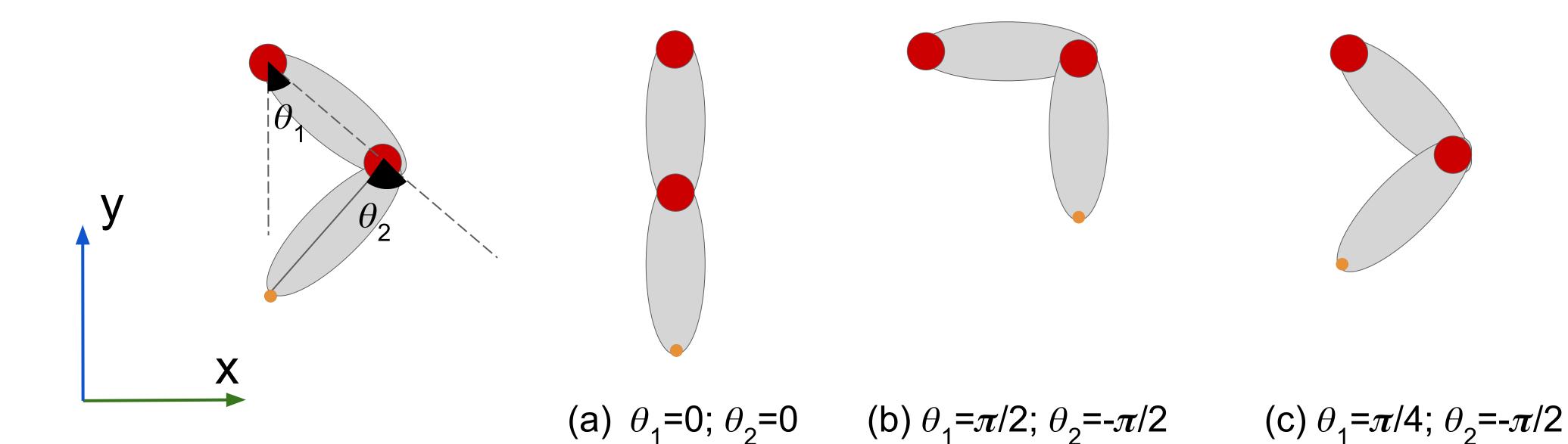
Affine transformation: combine translation and rotation

Multiply from the right!

$$\mathbf{x}_w = (\mathbf{A}_1(\dots(\mathbf{A}_n\mathbf{x}_l)))$$

# Debug

- Start with fewer links
- Do NOT just guess or try random corrections
- Write unit tests



# Summary

FK and IK are widely used in robotics, computer graphics, and many engineering applications

FK is a nonlinear mapping from joint angles to the position of end-effectors in the world coordinate

FK can be calculated efficiently via iteratively performing transformations (matrix multiplications) from one joint to the next

#### Office Hour

Time: This Friday 3-4 pm

Location: Outside of Karen's office (Coda E356)

Topic: Anything about AI and Robotics