



## Course Logistics

- Quiz 3 was posted yesterday and was due at noon today.
- Project 2 was posted on 02/05 and will be due 02/12 (tonight).
- Project 3 will be posted today (02/12) and will be due on 02/19.
  - An announcement will be made when we release it.
- Any questions on the late day tokens?





## Previously







### **Today's lecture**

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- Proportional-Integral-Derivative Control
- Sum of different responses to error
- Based on the mass spring and damper system
- Feedback correction based on the current error, past error, and predicted future error







### Error signal:

$$e(t) = x_{desired}(t) - x(t)$$

### Control signal:

$$u(t) = K_{p}e(t) + K_{i}\int_{0}^{t} e(\alpha)d\alpha + K_{a}$$

$$P \quad K_{p}e(t) \quad I \quad K_{i}\int_{0}^{t} e(\alpha)d\alpha \quad D$$

$$Current \quad Past \quad Fut$$





### cure

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## Consider PID wrt. state over time







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### **Desired State** (Setpoint)

### X<sub>t</sub> Current State



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Time











### **Desired State** (Setpoint)



### Integral term adds force until error is zero





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Time

























## PID Convergence 1.4





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## PID as a spring and damper model





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### Error signal:

$$e(t) = x_{desired}(t) - x(t)$$

### Control signal:

$$u(t) = K_{p}e(t) + K_{i}\int_{0}^{t} e(\alpha)d\alpha + K_{a}$$

$$P \quad K_{p}e(t) \quad I \quad K_{i}\int_{0}^{t} e(\alpha)d\alpha \quad D$$

$$Current \quad Past \quad Fut$$





ure

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## Hooke's Law



### • Describes motion of mass spring damper system as

## F = -kx



### Robert Hooke (1635 - 1703)





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## Hooke's Law



### Describes motion of mass spring damper system as







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### Error signal:

$$e(t) = x_{desired}(t) - x(t)$$

### Control signal:

$$u(t) = K_p e(t) + K_i \int_0^t e(\alpha) d\alpha + K_d$$

$$P \quad K_r e(t) \quad I \quad K_i \int_0^t e(\alpha) d\alpha \quad D$$

$$Current \quad Past \quad Fut$$





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## Spring and Damper $K_{^d} rac{de(t)}{dt}$ . $K_{p}e(t)$ D $F = -kx + -b\dot{x}$ assuming constant set point, velocity is derivative of error

### add damper to release energy

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### Error signal:

$$e(t) = x_{desired}(t) - x(t)$$

### Control signal:

$$u(t) = K_p e(t) + K_i \int_0^t e(\alpha) d\alpha + K_d$$

$$P \quad K_r e(t) \quad I \quad K_i \int_0^t e(\alpha) d\alpha \quad D$$

$$Current \quad Past \quad Fut$$





ure

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# Steady state error

- Steady state error occurs when the system rests at equilibrium before reaching desired state
- Cause could be an significant external force, weak motor, low proportional gain, etc.
- PID integral term compensates by accumulating and acting against error toward convergence







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- Implementing PID algorithm will not necessarily produce a good controller
- Selection of the gains will greatly affect the performance of the controller

$$u(t) = K_p e(t) + K_i \int_0^t e(\alpha) d\alpha + K_d \frac{d}{dt} e(t)$$

$$P \quad K_p e(t) \quad I \quad K_i \int_0^t e(\alpha) d\alpha \quad D \quad K_d \frac{de(t)}{dt}$$



## Gain tuning

• PID gain tuning is more of an art than a science. Choose carefully.

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## Some tips to PID tuning (take it or leave it)

- Start all gains at zero :  $K_i = K_d = K_p = 0$
- Increase spring gain  $K_p$  until system roughly meets desired state
  - overshooting and oscillation about the desired state can be expected
- Increase damping gain  $K_d$  until the system is consistently stable
  - damping stabilizes motion, but system will have steady state error
- Increase integral gain  $K_i$  until the system consistently reaches desired
- Refine gains as needed to improve performance; Test from different states





# Inverse Kinematics





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## Robot Kinematics

**Goal**: Given the structure of a robot arm, compute

- Forward kinematics: infer the pose of the end-effector, given the state of each joint

- Inverse kinematics: inferring the joint states necessary to reach a desired end-effector pose.





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### **Forward kinematics:** many-to-one mapping of robot configuration to reachable workspace endeffector poses





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### *Inverse kinematics*: one-to-many mapping of workspace endeffector pose to robot configuration





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### **Inverse kinematics**: how to solve for $q = \{\theta_1, \dots, \theta_N\}$ from $T_0^N$ ?





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# Inverse Kinematics: 2 possibilites

- **Closed-form solution**: geometrically infer satisfying configuration
  - Speed: solution often computed in constant time
  - Predictability: solution is selected in a consistent manner
- Solve by optimization: minimize error of endeffector to desired pose
  - often some form of Gradient Descent (a la Jacobian Transpose)
  - Generality: same solver can be used for many different robots





# Let's define IK starting from FK





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### Consider a planar 3-link arm as an example







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### with 2 shown links with length $\alpha_i$ , ...

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### with 3 links, 2 joints (0, 1), ...

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# with 3 links, 2 joints (0, 1), coordinate frames at

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# and N+1 link frames

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Consider a planar 3-link arm as an example Frame 2 is the "tool frame"

Robot **endeffector** is the gripper pose in world frame

 $y_0$ 

Endeffector pose has position **o**<sup>0</sup><sub>N</sub> and can consider orientation  $\mathbf{R}^{0}_{N}$ 

Endeffector defines "tool frame" with transform  $H=T^{0}N$  to world frame 7/7/7/





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### Endeffector axes







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## What are end-effectors?









https://www.tthk.ee/inlearcs/7-robot-end-of-arm-tooling/



## What are end-effectors?



Shi, Haochen, Huazhe Xu, Samuel Clarke, Yunzhu Li, and Jiajun Wu. "RoboCook: Long-Horizon Elasto-Plastic Object Manipulation with Diverse Tools." arXiv preprint arXiv:2306.14447 (2023). https://hshi74.github.io/robocook/

https://www.tthk.ee/inlearcs/7-robot-end-of-arm-tooling/



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## **Forward kinematics:** "given configuration, compute endeffector" $y_2$ $x_2$ $y_0$ $p^0$ $y_1$ Robot configuration $x_1$ defined by DoF state 2 angular DOFs $q = [\theta_1, \theta_2]$ $x_0$ 7////





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# Forward kinematics: $[\mathbf{o}_{N}, \mathbf{R}_{N}] = f(\mathbf{q})$ $y_0$ $y_1$ Robot configuration defined by DoF state 2 angular DOFs $q = [\theta_1, \theta_2]$ 11///





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## Forward kinematics: $[\mathbf{0}^{0}N, \mathbf{R}^{0}N] = f(\mathbf{q})$



### What are the elements of this matrix?



 $\mathbf{R}_N^0 =$ 







$$d_2^0 =$$

$$\mathbf{o}_N^0 = \begin{bmatrix} W^t \end{bmatrix}$$



## Start with:

- $= R_1 0 d_2 1 + d_1 0$
- substitute in variables then perform operations:  $\begin{bmatrix} \cos\theta_1 & -\sin\theta_1 \\ \sin\theta_1 & \cos\theta_1 \end{bmatrix} \begin{bmatrix} \alpha_2 \cos\theta_2 \\ \alpha_2 \sin\theta_2 \end{bmatrix} + \begin{bmatrix} \alpha_1 \cos\theta_1 \\ \alpha_1 \sin\theta_1 \end{bmatrix}$ 
  - then substitute trig identities cos(x + y) = cos(x)cos(y) - sin(x)sin(y)sin(x + y) = sin(x)cos(y) + cos(x)sin(y)to get:

nat are the elements of this vector?

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## Forward kinematics: $[\mathbf{O}_{N}, \mathbf{R}_{N}] =$







$$f(\mathbf{q})$$

$$y_{2}$$

$$p^{0}$$

$$p^{0} = f(\theta_{1}, \theta_{2})$$

$$p^{0} = T_{1}^{0}T_{2}^{1}p^{2}$$

$$p^{0} = T_{2}^{0}p^{2}$$

$$p^{0} = T_{2}^{0}(\theta_{1}, \theta_{2})p$$

$$p^{0} = T_{1}^{0}(\theta_{1}, \theta_{2})p$$

$$p^{0} = T_{1}^{0}(\theta_{1}, \theta_{2})p$$

$$p^{0} = T_{1}^{0}(\theta_{1}, \theta_{2})p$$

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## **Inverse kinematics:** "given endeffector, compute configuration" $y_2$ $x_2$ $y_0$ $y_1$ $x_1$



1/1//





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# Inverse kinematics: $q = f^{-1}([o_N, R_N])$ $y_0$ $y_1$ 11/1/





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# Inverse kinematics: $\mathbf{q} = f^{-1}([\mathbf{o}_{N_1} \mathbf{R}_{N_1}])$ $[\theta_{1,\theta_2}] = f^{-1}(\mathbf{x},\mathbf{y})$ $y_0$ $y_1$





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# Inverse kinematics: $\mathbf{q} = f^{-1}([\mathbf{o}_N, \mathbf{R}_N])$ $[\theta_1, \theta_2] = f^{-1}(\mathbf{x}, \mathbf{y})$ $y_0$ $y_1$ /////







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## inverse kinematics: $(\theta_1, \theta_2) = f^{-1}(x, y)$







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## elbow down

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## when is there one solution?

### elbow down

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## when is there no solution?

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# when is there no

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### :=: Try this http://scratch.mit.edu/projects/10607750/ Instructions - Steer blue arm using up/down keys - Steer green arm using right/left keys - Steer orange arm using A/D keys Touch the blue dot with the tip of the arm as many times as you can in 60 seconds!

Touch this to start!





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# Inverse Kinematics: 2D





 $T_n^0(q_1,\ldots,q_n) = H$ 

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# Inverse Kinematics: 2D









Configuration  $T_n^0(q_1,\ldots,q_n) = H$  endeffector frame to world frame  $H = \begin{bmatrix} R & o \\ 0 & 1 \end{bmatrix}$ 

 $H = \begin{bmatrix} r_{11} & r_{12} & o_x \\ r_{21} & r_{22} & o_y \\ 0 & 0 & 1 \end{bmatrix}$ 

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## Inverse Kinematics: 2D

# Configuration $T_n^0(q_1,\ldots,q_n) = H$ Transform from endeffector

$$H = \begin{bmatrix} R & o \\ 0 & 1 \end{bmatrix}$$

Closed form solution  $H = \begin{bmatrix} r_{11} & r_{12} & o_x \\ r_{21} & r_{22} & o_y \\ 0 & 0 & 1 \end{bmatrix}$ 

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Closed form solution  

$$\pi - \theta_2 = \cos^{-1}(\frac{\alpha_1^2 + \alpha_2^2 - x^2 - y^2}{2\alpha_1 \alpha_2})$$
 $\theta_1 = \tan^{-1}(y/x) - \tan^{-1}\left(\frac{\alpha_2 \sin \theta_2}{\alpha_1 + \alpha_2 \cos \theta_2}\right)$ 
 $H = \begin{bmatrix} r_{11} & r_{12} & o_x \\ r_{21} & r_{22} & o_y \\ 0 & 0 & 1 \end{bmatrix}$ 

## Inverse Kinematics: 2D

$$\ldots, q_n) = H$$
 Transform from  $from H$  endeffector

$$H = \begin{bmatrix} R & o \\ 0 & 1 \end{bmatrix}$$

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## Inverse Kinematics: 3D

# Configuration $T_n^0(q_1, \ldots, q_n) = H$ Transform from endeffector

$$H = \begin{bmatrix} R & o \\ 0 & 1 \end{bmatrix}$$



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## Inverse Kinematics: 3D

# Configuration $T_n^0(q_1, \ldots, q_n) = H$ Transform from endeffector

$$H = \begin{bmatrix} R & o \\ 0 & 1 \end{bmatrix}$$

 $H = \begin{bmatrix} r_{11} & r_{12} & r_{13} & o_x \\ r_{21} & r_{22} & r_{23} & o_y \\ r_{31} & r_{32} & r_{33} & o_z \end{bmatrix}$ Le BOF position and J orientation of endeffector

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## Stanford Manipulator

$$c_1[c_2(c_4c_5c_6 - s_4s_6) - s_2s_5c_6] - s_1(s_4c_5c_6 + c_4s_6) = r$$
  
$$s_1[c_2(c_4c_5c_6 - s_4s_6) - s_2s_5c_6] + c_1(s_4c_5c_6 + c_4s_6) = r$$

$$-s_2(c_4c_5c_6 - s_4s_6) - c_2s_5s_6 = r$$

$$-c_2(c_4c_5s_6 + s_4c_6) + s_2s_5s_6] - s_1(-s_4c_5s_6 + c_4c_6) = r$$

$$-c_2(c_4c_5s_6 + s_4c_6) + s_2s_5s_6] + c_1(-s_4c_5s_6 + c_4c_6) = r$$

$$s_2(c_4c_5s_6 + s_4c_6) + c_2s_5s_6 = i$$

$$c_1(c_2c_4s_5 + s_2c_5) - s_1s_4s_5 = r$$

$$s_1(c_2c_4s_5 + s_2c_5) + c_1s_4s_5 = r$$

$$-s_2c_4s_5+c_2c_5 = r$$

$$c_1s_2d_3 - s_1d_2 + d_6(c_1c_2c_4s_5 + c_1c_5s_2 - s_1s_4s_5) = c_1s_1s_2d_3 - s_1s_2d_3 - s_1s_2d_$$

- $s_1s_2d_3 + c_1d_2 + d_6(c_1s_4s_5 + c_2c_4s_1s_5 + c_5s_1s_2)$ 
  - $c_2d_3 + d_6(c_2c_5 c_4s_2s_5)$ = $o_z$ .

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 $r_{11}$ 21**^**31  $r_{12}$  $r_{22}$  $r_{32}$  $r_{13}$  $r_{23}$  $r_{33}$  $o_x$  $o_y$ 5

#### Detect, pick, and place each character A student project Michigan



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## RexArm from the above videos





### Find: configuration $\boldsymbol{q} = [\boldsymbol{\theta}_1 \ \boldsymbol{\theta}_2 \ \boldsymbol{\theta}_3 \ \boldsymbol{\theta}_4]$ as robot joint angles

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#### link lengths (L<sub>4</sub>,L<sub>3</sub>,L<sub>2</sub>,L<sub>1</sub>)







### Find: configuration $\boldsymbol{q} = [\boldsymbol{\theta}_1 \ \boldsymbol{\theta}_2 \ \boldsymbol{\theta}_3 \ \boldsymbol{\theta}_4]$ as robot joint angles

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03

G=∆r

1 1 2 1 1

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#### link lengths (L<sub>4</sub>,L<sub>3</sub>,L<sub>2</sub>,L<sub>1</sub>)

#### endeffector position $[x_g y_g z_g]$ wrt. base frame





Zg

### Find: configuration $\boldsymbol{q} = [\boldsymbol{\theta}_1 \ \boldsymbol{\theta}_2 \ \boldsymbol{\theta}_3 \ \boldsymbol{\theta}_4]$ as robot joint angles

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G=∆r

1:

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- 1 1 2 1 1

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#### Given:

#### link lengths $(L_4, L_3, L_2, L_1)$

endeffector orientation  $\phi$ as angle wrt. plane centered at **0**<sub>3</sub> and parallel to ground plane

endeffector position  $[x_g y_g z_g]$ wrt. base frame



### Find: configuration $\boldsymbol{q} = [\boldsymbol{\theta}_1 \ \boldsymbol{\theta}_2 \ \boldsymbol{\theta}_3 \ \boldsymbol{\theta}_4]$ as robot joint angles

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rg.

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G= ≤ Ar

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### solve for $\theta_1$

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solve for  $\theta_1$ Q= atan2 (yq, Xg





### solve for $\theta_3$

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#### **Decoupling**: separate endeffector from rest of the robot at last joint



solve for  $\theta_3$ 

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#### **Decoupling**: separate endeffector from rest of the robot at last joint



solve for  $\theta_3$ 



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#### **Decoupling**: separate endeffector from rest of the robot at last joint





#### and joint 1 from rest of robot







solve for  $\theta_1$ Q= atan2 (yq, Xg S. 0 ZOK solve for  $\theta_3$ C 02 Zo. 03



03





























solve for  $\theta_1$ Q= atan2 (yg, Xg) solve for  $\theta_3$ Φ  $\cos \Theta_3 = \frac{\Delta 2 + \Delta r^2 - L_2^2 - L_3^2}{2L_2L_3}$ solver for  $\theta_2$  $\Theta_2 = ) \frac{\pi}{2} - \beta = \psi$  if  $\Theta_2 \ge 0$  'Elbow up' 1-B+4 + 03<0 "Elbow-down" solve  $\theta_4$ 03







solve for  $\theta_1$ Q= atan2 (yg, Xg) solve for  $\theta_3$  $\cos \Theta_3 = \frac{\Delta 2 + \Delta r^2 - L_2 - L_3^2}{2L_2L_3}$ solver for  $\theta_2$  $\Theta_2 = )\frac{\pi}{2} - \beta = \psi$  if  $\Theta_2 \ge 0$  'Elbow up' 12-B+4 + 03<0 "Elbow-down" Equilvalence relation for for  $\theta_4$ solve adding angles from















# Why Closed Form?

- Advantages
  - <u>Speed</u>: IK solution computed in constant time
  - <u>Predictability</u>: consistency in selecting satisfying IK solution
- Disadvantage



• <u>Generality</u>: general form for arbitrary kinematics difficult to express

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## Inverse Kinematics: 2 possibilites

- **Closed-form solution**: geometrically infer satisfying configuration
  - Speed: solution often computed in constant time
  - Predictability: solution is selected in a consistent manner
- Solve by optimization: minimize error of endeffector to desired pose
  - often some form of Gradient Descent (a la Jacobian Transpose)
  - Generality: same solver can be used for many different robots





## Next lecture: Inverse Kinematics continued ...





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https://en.wikipedia.org/wiki/Canadarm



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