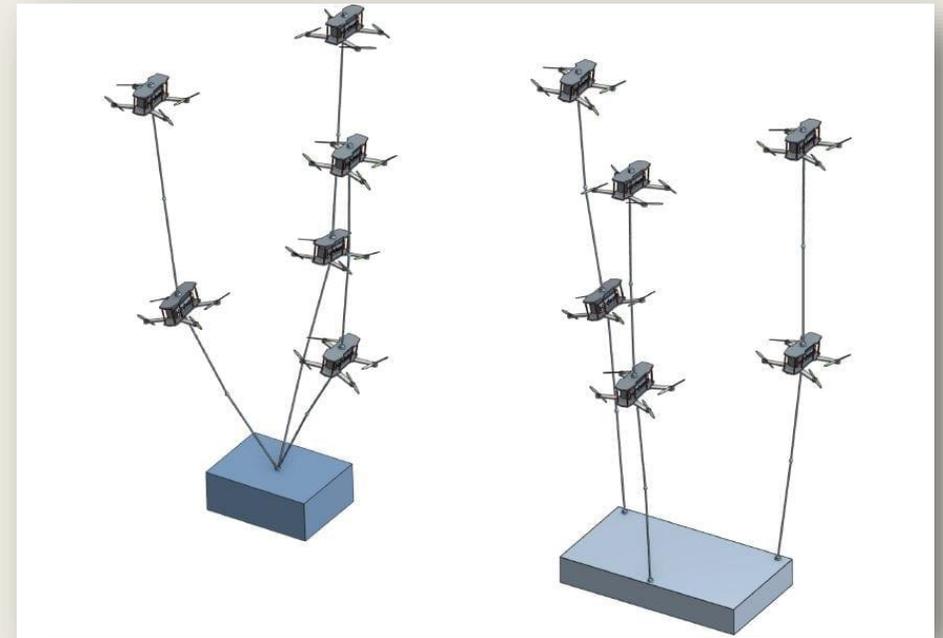
A decorative frame consisting of thick black lines forming an L-shape. One vertical line is on the left side, and one horizontal line is at the top, meeting at the top-left corner. Another vertical line is on the right side, and another horizontal line is at the bottom, meeting at the bottom-right corner.

# MODELING A QUADCOPTER AND SIMPLE PENDULUM

Christian Llanes

# Motivation

- **Goal:** Autonomous drone cooperation
  - *Building structures*
  - *Transporting packages*
  
- **Requires:** Robust control algorithms or model the dynamics for the coupled system.



[Muhammad Usama, "Stack Approach to Cooperative Drone Lifting", DroneBelow ]

# Outline

- Quadcopter Dynamics
- Quadcopter and Pendulum Free Body Diagram
- Lagrangian Mechanics
- Quadcopter and Pendulum Equations of Motion
- Simulation Results

# Quadcopter dynamics

## States

$$\mathbf{x} = [\mathbf{p}, \mathbf{v}, \mathbf{E}, \boldsymbol{\omega}]^T$$

$$\mathbf{p} = [p_x, p_y, p_z]$$

$$\mathbf{v} = [v_x, v_y, v_z]$$

$$\mathbf{E} = [\phi, \theta, \psi]$$

$$\boldsymbol{\omega} = [\omega_x, \omega_y, \omega_z]$$

## Controls

$$\mathbf{u} = [\tau, M_x, M_y, M_z]^T$$

## Equations of Motion for a Rigid Body

$$\dot{\mathbf{p}} = \mathbf{v}$$

$$\dot{\mathbf{v}} = g\vec{e}_z - \frac{1}{m} \mathbf{R}_B^E \tau \vec{b}_z$$

$$\dot{\mathbf{E}} = \boldsymbol{\Gamma}(\mathbf{E})^{-1} \boldsymbol{\omega}$$

$$\dot{\boldsymbol{\omega}} = \mathbf{J}^{-1}(\mathbf{M} - \boldsymbol{\omega} \times \mathbf{J} \boldsymbol{\omega})$$

## Expanded Equations of Motion

$$\dot{p}_x = v_x$$

$$\dot{p}_y = v_y$$

$$\dot{p}_z = v_z$$

$$\dot{v}_x = -\frac{\tau}{m} [\cos \phi \cos \psi \sin \theta + \sin \phi \sin \psi]$$

$$\dot{v}_y = -\frac{\tau}{m} [\cos \phi \sin \theta \sin \psi - \sin \phi \cos \psi]$$

$$\dot{v}_z = g - \frac{\tau}{m} [\cos \phi \cos \theta]$$

$$\dot{\phi} = \omega_x + \omega_y \sin \phi \tan \theta + \omega_z \cos \phi \tan \theta$$

$$\dot{\theta} = \omega_y \cos \phi - \omega_z \sin \phi$$

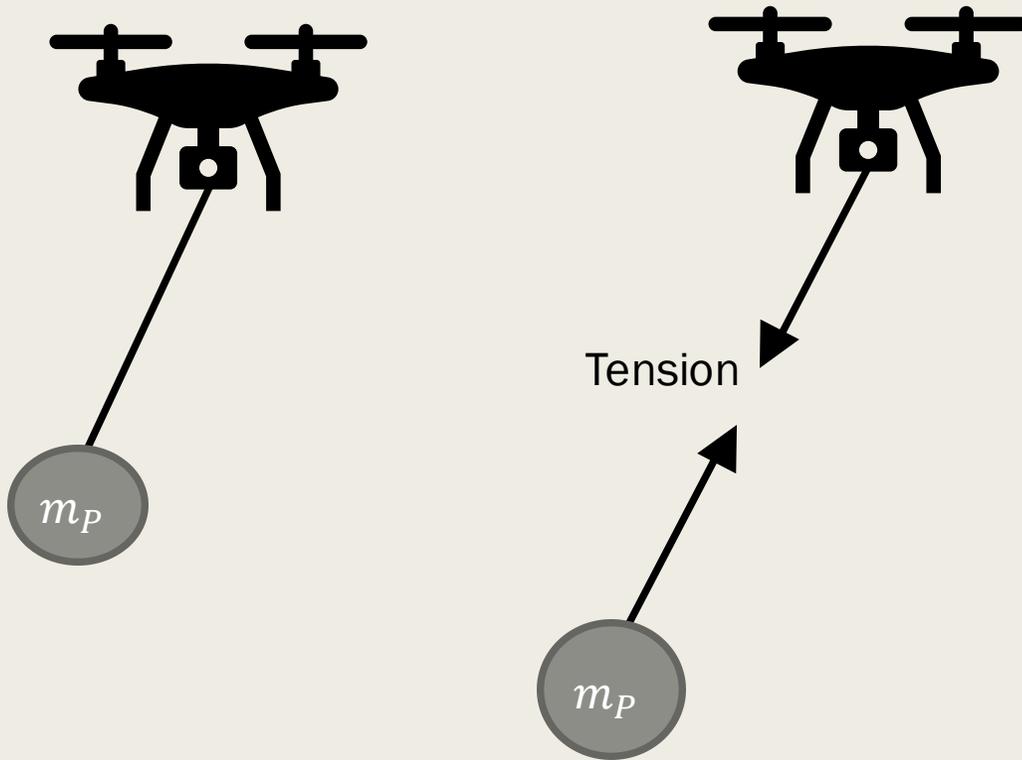
$$\dot{\psi} = \omega_y \sin \phi \sec \theta + \omega_z \cos \phi \sec \theta$$

$$\dot{\omega}_x = \frac{(I_y - I_z)}{I_x} \omega_y \omega_z + \frac{M_x}{I_x}$$

$$\dot{\omega}_y = \frac{(I_z - I_x)}{I_y} \omega_x \omega_z + \frac{M_y}{I_y}$$

$$\dot{\omega}_z = \frac{(I_x - I_y)}{I_z} \omega_x \omega_y + \frac{M_z}{I_z}$$

# A Simple Pendulum attached to a Quadcopter



Newtonian Mechanics

$$\sum F_P = m_P \vec{a}_P$$

$$\sum F_Q = m_Q \vec{a}_Q$$

$$\sum M_Q = J \vec{\alpha}_Q$$

Quite a complex method of computing the Equations of Motion...

# Lagrangian Mechanics

## ■ Hamilton's principle

- *The trajectory of  $N$  generalized coordinates  $\mathbf{q} = (q_1, q_2, q_3, \dots, q_N)$  for time  $t \in [t_1, t_2]$  is a stationary point of the action functional which is equivalent to the variation is equal to zero:*

$$\delta \int_{t_1}^{t_2} \mathcal{L}(t, \mathbf{q}(t), \dot{\mathbf{q}}(t)) dt = 0$$

- *The Lagrangian function for a system is  $\mathcal{L}(t, \mathbf{q}(t), \dot{\mathbf{q}}(t)) = T(t, \mathbf{q}(t), \dot{\mathbf{q}}(t)) - V(\mathbf{q}(t), t)$  where  $T$  is the kinetic energy and  $V$  is the potential energy of the system.*

## ■ Calculus of Variations

- *The variation of the Lagrangian function  $\mathcal{L}(t, \mathbf{q}(t), \dot{\mathbf{q}}(t))$  is zero if the generalized coordinates  $q_i(t)$  and generalized velocities  $\dot{q}_i(t)$  satisfy the Euler-Lagrange equations:*

$$\frac{d}{dt} \frac{\partial \mathcal{L}}{\partial \dot{q}_i} - \frac{\partial \mathcal{L}}{\partial q_i} = 0$$

# Lagrangian Mechanics

- For systems with non-conservative forces that are not potentials.
  - Introduce virtual work  $\delta W = \sum Q_i \delta q_i$  from generalized forces  $Q_i$  for the generalized coordinates  $\mathbf{q} = (q_1, q_2, q_3, \dots, q_N)$ . The extended Hamilton's principle is therefore,

$$\int_{t_1}^{t_2} (\delta \mathcal{L} + \delta W) dt = 0$$

The variation can only be zero if the integrand is zero which is equivalent to:

$$\frac{d}{dt} \frac{\partial \mathcal{L}}{\partial \dot{q}_i} - \frac{\partial \mathcal{L}}{\partial q_i} = Q_i$$

The generalized forces and moments are projections of the non-conservative forces in the generalized coordinates for  $P$  particles:

$$Q_i = \sum_{j=1}^P \vec{F}_j \cdot \frac{\partial \vec{v}_j}{\partial \dot{q}_i}$$

# A Simple Pendulum attached to a Quadcopter

- ❑ Quadcopter frame 1-2-3 (roll-pitch-yaw)
- ❑ Pendulum frame 1-2 (roll-pitch)

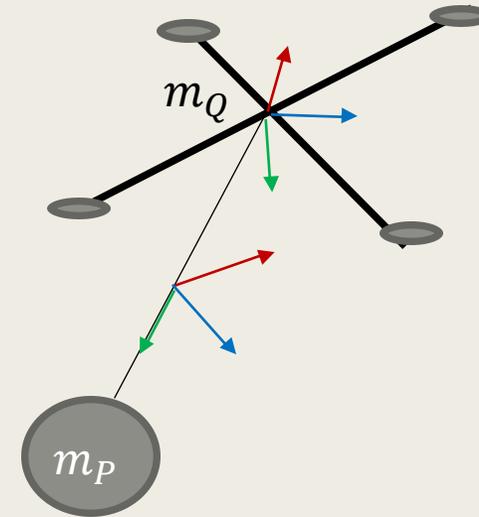
➤ Position of quadrotor,  $\mathbf{r}_Q$

➤ Velocity of quadrotor,  $\mathbf{v}_Q = \frac{d\mathbf{r}_Q}{dt} = \{v_x, v_y, v_z\}$

➤ Position of pendulum,  $\mathbf{r}_P = \mathbf{r}_Q + DCM^T(\alpha, \beta) \begin{bmatrix} 0 \\ 0 \\ L \end{bmatrix} = \begin{bmatrix} L \cos[\alpha[t]] \sin[\beta[t]] + x[t] \\ -L \sin[\alpha[t]] + y[t] \\ L \cos[\alpha[t]] \cos[\beta[t]] + z[t] \end{bmatrix}$

➤ Velocity of pendulum,  $\mathbf{v}_P = \frac{d\mathbf{r}_P}{dt} = \begin{bmatrix} x'[t] - L \sin[\alpha[t]] \sin[\beta[t]] \alpha'[t] + L \cos[\alpha[t]] \cos[\beta[t]] \beta'[t] \\ y'[t] - L \cos[\alpha[t]] \alpha'[t] \\ z'[t] - L \cos[\beta[t]] \sin[\alpha[t]] \alpha'[t] - L \cos[\alpha[t]] \sin[\beta[t]] \beta'[t] \end{bmatrix}$

➤ Assume quadrotor is symmetric so that moment of inertia tensor  $J = \begin{bmatrix} I_{xx} & 0 & 0 \\ 0 & I_{yy} & 0 \\ 0 & 0 & I_{zz} \end{bmatrix}$



# Lagrangian Mechanics for the Quadrotor and Simple Pendulum

- Define the 8 generalized coordinates of the system:

- $\mathbf{q} = (x, y, z, \phi, \theta, \psi, \alpha, \beta)$

- Define the kinetic and potential energy functions:

$$T = \frac{1}{2} m_P \mathbf{v}_P^T \mathbf{v}_P + \frac{1}{2} m_Q \mathbf{v}_Q^T \mathbf{v}_Q + \frac{1}{2} \boldsymbol{\omega}_Q^T \mathbf{J} \boldsymbol{\omega}_Q$$

$$V = -m_P g z_P - m_Q g z_Q$$

- The Lagrangian is then,

$$\mathcal{L} = T - V = \frac{1}{2} m_P \mathbf{v}_P^T \mathbf{v}_P + \frac{1}{2} m_Q \mathbf{v}_Q^T \mathbf{v}_Q + \frac{1}{2} \boldsymbol{\omega}_Q^T \mathbf{J} \boldsymbol{\omega}_Q + m_P g z_P + m_Q g z_Q$$

# Lagrange's Equation

- Generalized coordinates are :  $[x, y, z, \phi, \theta, \psi, \alpha, \beta]$
- Generalized velocities:  $[v_x, v_y, v_z, \omega_x, \omega_y, \omega_z, \dot{\alpha}, \dot{\beta}]$
- Use Mathematica to solve the 8 Euler-Lagrange equations for the time derivative of the generalized velocities.

```

LEq1 = Simplify[(D[D[T, x'[t]], t] - D[T, x[t]] + D[V, x[t]])[[1]][[1]] = F.vQuad1 /. KDE /. KDED];
LEq2 = Simplify[(D[D[T, y'[t]], t] - D[T, y[t]] + D[V, y[t]])[[1]][[1]] = F.vQuad2 /. KDE /. KDED];
LEq3 = Simplify[(D[D[T, z'[t]], t] - D[T, z[t]] + D[V, z[t]])[[1]][[1]] = F.vQuad3 /. KDE /. KDED];
LEq4 = Simplify[(D[D[T, phi'[t]], t] - D[T, phi[t]] + D[V, phi[t]])[[1]][[1]] = (M.wQuad1)[[1]] /. KDE /. KDED];
LEq5 = Simplify[(D[D[T, theta'[t]], t] - D[T, theta[t]] + D[V, theta[t]])[[1]][[1]] = (M.wQuad2)[[1]] /. KDE /. KDED];
LEq6 = Simplify[(D[D[T, psi'[t]], t] - D[T, psi[t]] + D[V, psi[t]])[[1]][[1]] = (M.wQuad3)[[1]] /. KDE /. KDED];
LEq7 = Simplify[(D[D[T, alpha'[t]], t] - D[T, alpha[t]] + D[V, alpha[t]])[[1]][[1]] = 0 /. KDE /. KDED];
LEq8 = Simplify[(D[D[T, beta'[t]], t] - D[T, beta[t]] + D[V, beta[t]])[[1]][[1]] = 0 /. KDE /. KDED];
LEqs = Simplify[Solve[{LEq1, LEq2, LEq3, LEq4, LEq5, LEq6, LEq7, LEq8}, {u1'[t], u2'[t], u3'[t], u4'[t], u5'[t], u6'[t], u7'[t], u8'[t]}]]

{{u1'[t] -> (1/(mQ*(mP+mQ)) * (-1/16 * mQ * Thrust * (Sin[phi[t]] * (-8 * mP * Cos[psi[t]] * Sin[2*alpha[t]] * Sin[beta[t]] + (14 * mP + 16 * mQ - 2 * mP * Cos[2*alpha[t]] + mP * Cos[2*(alpha[t] - beta[t])) + 2 * mP * Cos[2*beta[t]] + mP * Cos[2*(alpha[t] + beta[t]))] * Sin[psi[t]])) +
Cos[phi[t]] * Sin[theta[t]] * ((14 * mP + 16 * mQ - 2 * mP * Cos[2*alpha[t]] + mP * Cos[2*(alpha[t] - beta[t])) + 2 * mP * Cos[2*beta[t]] + mP * Cos[2*(alpha[t] + beta[t]))] * Cos[psi[t]] + 8 * mP * Sin[2*alpha[t]] * Sin[beta[t]] * Sin[psi[t])) -
8 * mP * Cos[alpha[t]]^2 * (Cos[theta[t]] * Cos[phi[t]] * Sin[2*beta[t]] + Sin[beta[t]]^2 * (Cos[phi[t]] * Cos[psi[t]] * Sin[theta[t]] + Sin[phi[t]] * Sin[psi[t]])) + L * mP * mQ^2 * Cos[alpha[t]] * Sin[beta[t]] * u7[t]^2 + L * mP * mQ^2 * Cos[alpha[t]]^3 * Sin[beta[t]] * u8[t]^2)},
u2'[t] -> -1/(2 * mQ * (mP + mQ)) * (Thrust * (mP * Cos[beta[t]] * Cos[theta[t]] * Cos[phi[t]] * Sin[2*alpha[t]] + Cos[phi[t]] * Sin[theta[t]] * (mP * Cos[psi[t]] * Sin[2*alpha[t]] * Sin[beta[t]] + (mP + 2 * mQ + mP * Cos[2*alpha[t]]) * Sin[psi[t])) - Sin[phi[t]] * ((mP + 2 * mQ + mP * Cos[2*alpha[t])) * Cos[psi[t]] - mP * Sin[2*alpha[t]] * Sin[beta[t]] * Sin[psi[t])) +
2 * L * mP * mQ * Sin[alpha[t]] * u7[t]^2 + 2 * L * mP * mQ * Cos[alpha[t]]^2 * Sin[alpha[t]] * u8[t]^2)},
u3'[t] -> 1/(4 * mQ * (mP + mQ)) * (4 * g * mP * mQ + 4 * g * mQ^2 - 3 * mP * Thrust * Cos[theta[t]] * Cos[phi[t]] - 4 * mQ * Thrust * Cos[theta[t]] * Cos[phi[t]] + mP * Thrust * Cos[alpha[t]]^2 * Cos[theta[t]] * Cos[phi[t]] + mP * Thrust * Cos[beta[t]]^2 * Cos[theta[t]] * Cos[phi[t]] + mP * Thrust * Cos[alpha[t]]^2 * Cos[beta[t]]^2 * Cos[theta[t]] * Cos[phi[t]] -
mP * Thrust * Cos[theta[t]] * Cos[phi[t]] * Sin[alpha[t]]^2 - mP * Thrust * Cos[beta[t]]^2 * Cos[theta[t]] * Cos[phi[t]] * Sin[alpha[t]]^2 - mP * Thrust * Cos[theta[t]] * Cos[phi[t]] * Sin[beta[t]]^2 - mP * Thrust * Cos[alpha[t]]^2 * Cos[theta[t]] * Cos[phi[t]] * Sin[beta[t]]^2 +
mP * Thrust * Cos[theta[t]] * Cos[phi[t]] * Sin[alpha[t]]^2 * Sin[beta[t]]^2 + mP * Thrust * Cos[phi[t]] * Cos[psi[t]] * Sin[2*beta[t]] * Sin[theta[t]] + mP * Thrust * Cos[alpha[t]]^2 * Cos[phi[t]] * Cos[psi[t]] * Sin[2*beta[t]] * Sin[theta[t]] -
mP * Thrust * Cos[phi[t]] * Cos[psi[t]] * Sin[alpha[t]]^2 * Sin[2*beta[t]] * Sin[theta[t]] + 2 * mP * Thrust * Cos[beta[t]] * Cos[psi[t]] * Sin[2*alpha[t]] * Sin[theta[t]] * Sin[psi[t]] +
mP * Thrust * Sin[2*beta[t]] * Sin[phi[t]] * Sin[psi[t]] + mP * Thrust * Cos[alpha[t]]^2 * Sin[2*beta[t]] * Sin[phi[t]] * Sin[psi[t]] - mP * Thrust * Sin[alpha[t]]^2 * Sin[2*beta[t]] * Sin[phi[t]] * Sin[psi[t]] + 4 * L * mP * mQ * Cos[alpha[t]] * Cos[beta[t]] * u7[t]^2 + 4 * L * mP * mQ * Cos[alpha[t]]^3 * Cos[beta[t]] * u8[t]^2)},
u4'[t] -> (Mx + (Iyy - Izz) * u5[t] * u6[t]) / Ixx, u5'[t] -> (My + (-Ixx + Izz) * u4[t] * u6[t]) / Iyy, u6'[t] -> (Mz + (Ixx - Iyy) * u4[t] * u5[t]) / Izz,
u7'[t] -> -Sin[alpha[t]] * (Thrust * (Cos[beta[t]] * Cos[theta[t]] * Cos[phi[t]] + Cos[phi[t]] * Sin[theta[t]] * (Cos[psi[t]] * Sin[beta[t]] + Cot[alpha[t]] * Sin[psi[t]] + Sin[phi[t]] * (-Cos[psi[t]] * Cot[alpha[t]] + Sin[beta[t]] * Sin[psi[t])))) + L * mQ * Cos[alpha[t]] * u8[t]^2) / L * mQ,
u8'[t] -> (Thrust * Sec[alpha[t]] * (-Cos[theta[t]] * Cos[phi[t]] * Sin[beta[t]] + Cos[beta[t]] * (Cos[phi[t]] * Cos[psi[t]] * Sin[theta[t]] + Sin[phi[t]] * Sin[psi[t]])) + 2 * Tan[alpha[t]] * u7[t] * u8[t]) / L * mQ}

```

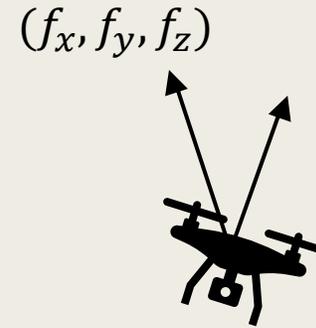
# Simulation in MATLAB

## ■ Designing a controller:

- $f_x = k_p \tanh(\sigma(p_{xdes} - p_x)) - k_v v_x$
- $f_y = k_p \tanh(\sigma(p_{ydes} - p_y)) - k_v v_y$
- $f_z = k_p \tanh(\sigma(p_{zdes} - p_z)) - (m_Q + m_P)g - k_v v_z$

- $\omega_{xcmd} = k_{prollrate}(\phi_{cmd} - \phi)$
- $\omega_{ycmd} = k_{ppitchrate}(\theta_{cmd} - \theta)$
- $\omega_{zcmd} = -k_{pyawrate} \psi$

- $M_x = k_{proll}(\omega_{xcmd} - \omega_x)$
- $M_y = k_{ppitch}(\omega_{ycmd} - \omega_y)$
- $M_z = k_{pyaw}(\omega_{zcmd} - \omega_z)$



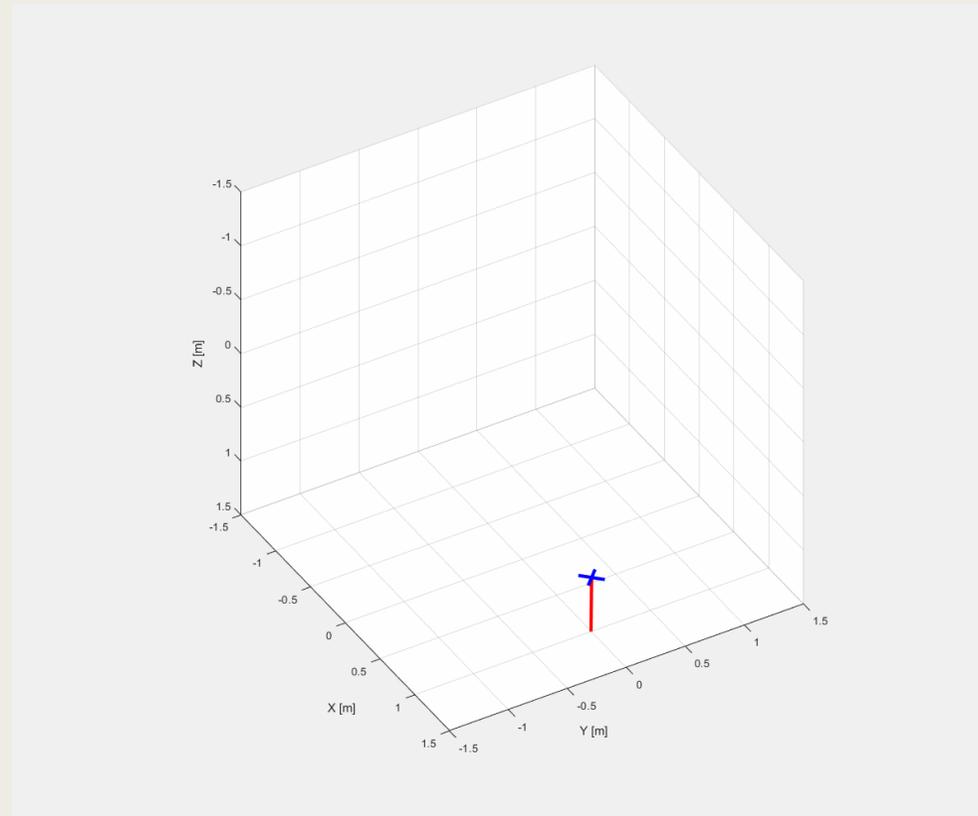
$(\theta_{cmd}, \phi_{cmd}, T_{cmd})$

# Simulation in MATLAB

- Implement the dynamic update equations with the controller from the previous slide.
- For the following simulations assume,  $m_Q = 1kg, L = 0.5m$

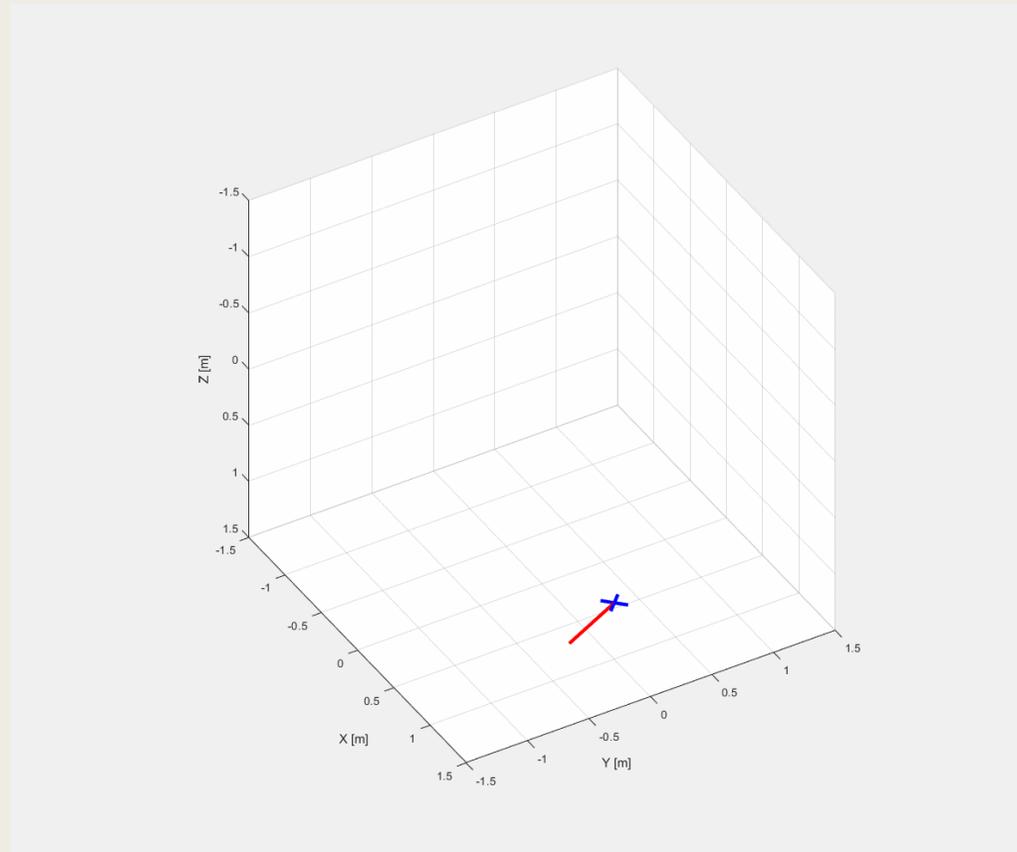
# Simulation in MATLAB

- Elliptical trajectory with,  $m_p = 0.1kg, \alpha(0) = 0, \beta(0) = 0$



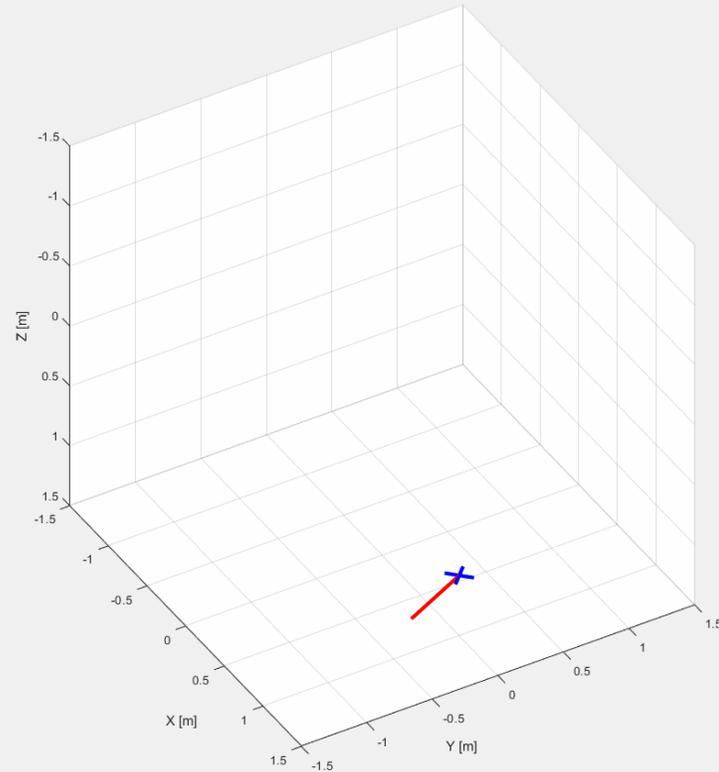
# Simulation in MATLAB

- Elliptical trajectory with,  $m_P = 0.1\text{kg}$ ,  $\alpha(0) = 1.2\text{rad}$ ,  $\beta(0) = 1.2\text{rad}$



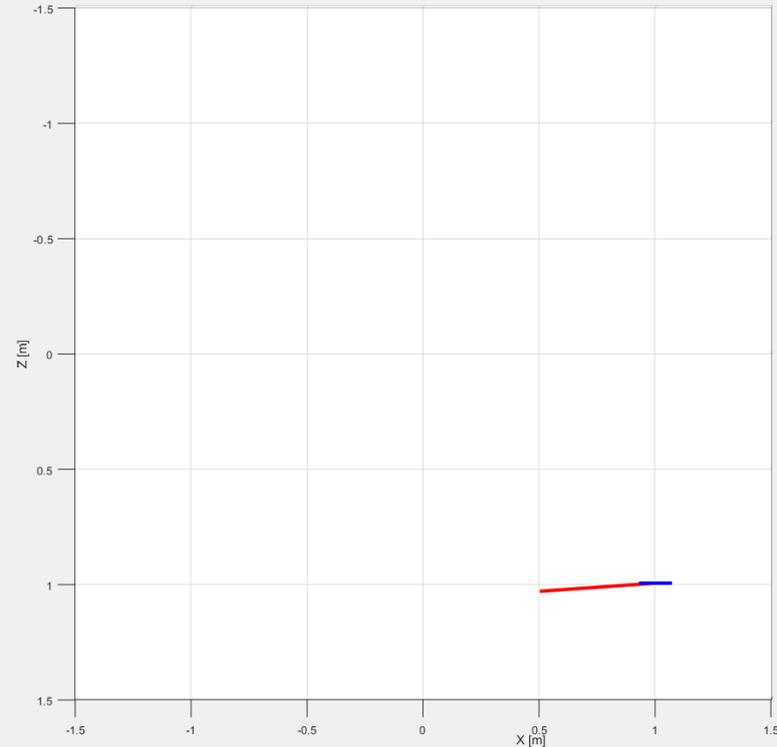
# Simulation in MATLAB

- Elliptical trajectory with,  $m_p = 0.5\text{kg}$ ,  $\alpha(0) = 1.2\text{rad}$ ,  $\beta(0) = 1.2\text{rad}$



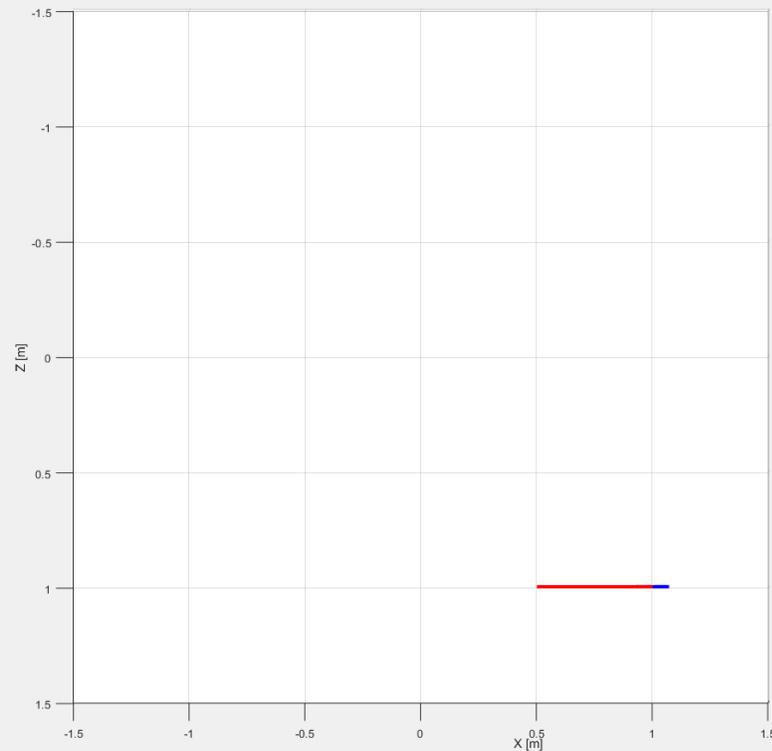
# Simulation in MATLAB

- Static setpoint with,  $m_p = 0.5kg, \alpha(0) = 0, \beta(0) = -1.5rad$



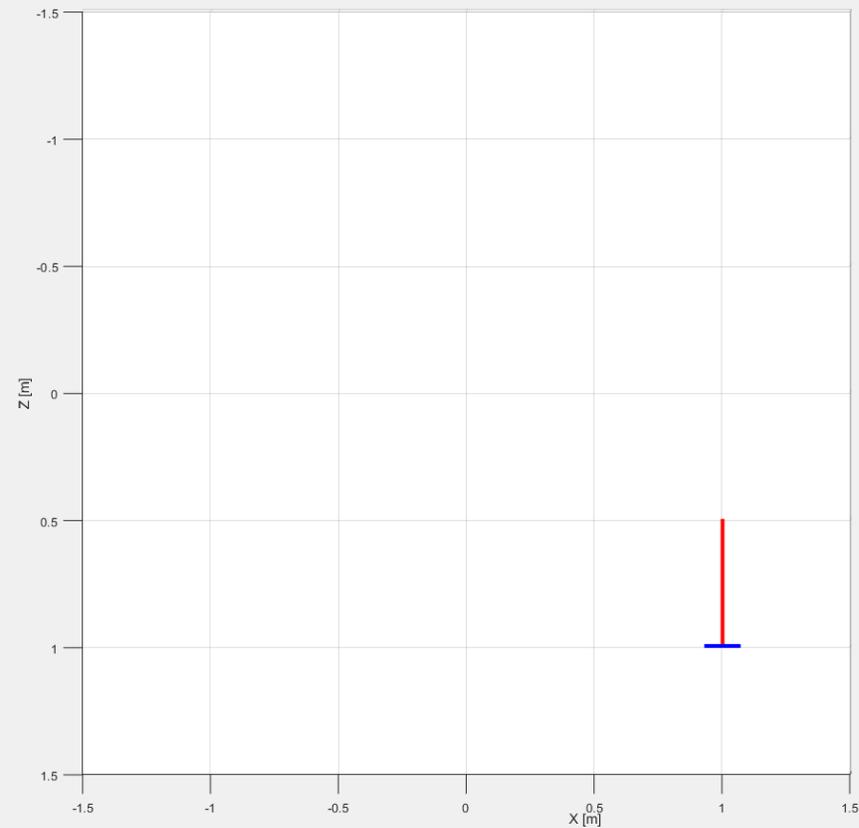
# Simulation in MATLAB

- Static setpoint with,  $m_p = 1.0kg, \alpha(0) = 0, \beta(0) = -1.571rad$



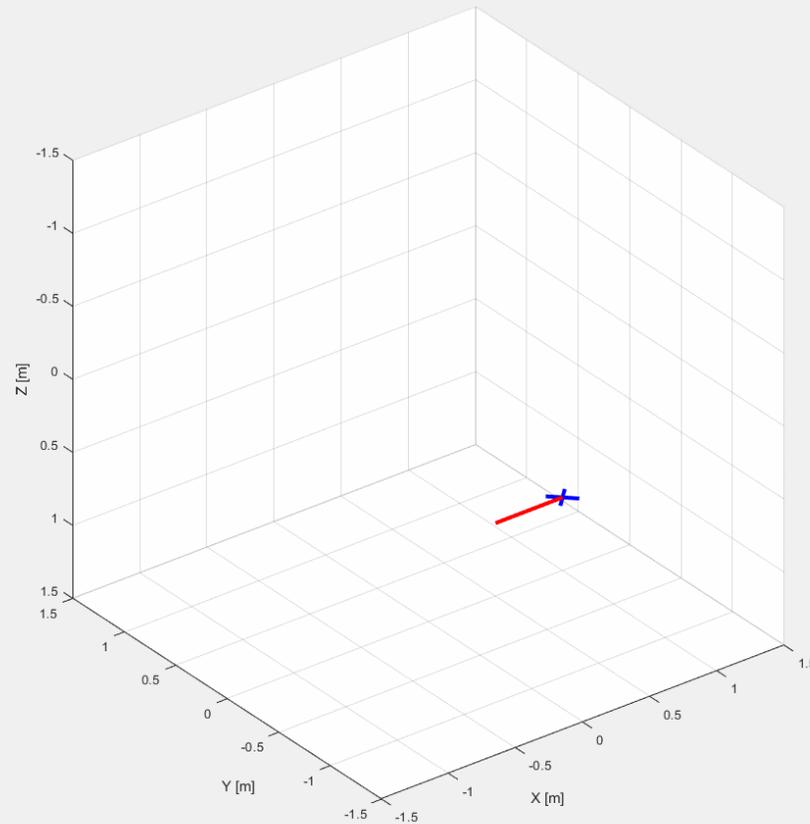
# Simulation in MATLAB

- Static setpoint with,  $m_p = 1.0kg, \alpha(0) = 0, \beta(0) = -3.14rad$



# Simulation in MATLAB

- Static setpoint with,  $m_p = 0.3kg, \alpha(0) = 0, \beta(0) = -1.571rad$



# Trajectory Planning with Dynamics of Quadrotor + Pendulum

- The controller in the simulations for this presentation is only a feedback controller. It does not account for the dynamics of the pendulum.
- Better controllers that account for the trajectory of the pendulum:
  - *Model Predictive Control*
  - *Differential Dynamic Programming (Solve the Hamilton-Jacobi-Bellman PDE)*