

```
In [1]: import gym
import pybulletgym
import pybulletgym.envs
import numpy as np
import math
import matplotlib.pyplot as plt
from numpy.linalg import pinv
```

```
In [2]: env = gym.make("ReacherPyBulletEnv-v0")
#env.render()
env.reset()
```

current_dir=/home/apurba/.virtualenvs/276c_assgn/lib/python3.6/site-packages/pybullet_envs/bullet
options=

```
Out[2]: array([-0.21537443, -0.07986251,  0.14044574,  0.18985098,  0.3391394
            3,
            0.94073612,  0.          ,  0.59053606,  0.          ])
```

```
In [4]: def getForwardModel (q0, q1, l0 = 0.1, l1 = 0.11):
    """
    Forward kinematics
    :param q0: Central Joint angle
    :param q1: Shoulder Joint angle
    :param l0: Arm Length l0
    :param l1: Arm Length l1
    :return: x1,x2 position
    """
    H_A_B = np.array([[np.cos(q0), -1 * np.sin(q0), l0 * np.cos(q0)],
                      [np.sin(q0), 1 * np.cos(q0), l0 * np.sin(q0)],
                      [0, 0, 1]])
    V_B = np.array([[l1 * np.cos(q1)],
                   [l1 * np.sin(q1)],
                   [1]]);
    V_A = np.matmul(H_A_B, V_B)
    final = V_A[:2, :]/V_A[2,:];
    return final
```

```
In [74]: def getJacobian (q0, q1, l0 = 0.1, l1 = 0.11):
    """
        Jacobian matrix
        :param q0: Central Joint angle
        :param q1: Shoulder Joint angle
        :param l0: Arm Length l0
        :param l1: Arm Length l1
        :return: Jacobian matrix
    """

    #J = np.zeros(shape=(2,2))
    J = np.array([[ -l1*np.sin(q1+q0) - l0*np.sin(q0), -l1*np.sin(q1+q0)],
                  [ l1*np.cos(q1+q0) + l0*np.cos(q0), l1*np.cos(q1+q0)]])
    return J;
```

```
In [8]: def getIK_analytical (x0 , x1, l0 = 0.1, l1 = 0.11):
    """
        Inverse kinematics (using Jacobian Inverse)
        :param x0: Current x0
        :param x1: Current x1
        :param l0: Arm Length l0
        :param l1: Arm Length l1
    """

    q1 = np.arccos((x0*x0 + x1*x1 - l0*l0 - l1*l1)/2*l1*l0)
    if((x0*x0 + x1*x1 - l0*l0 - l1*l1)/2*l1*l0 > 1):
        q1 = np.arccos(1)
    if((x0*x0 + x1*x1 - l0*l0 - l1*l1)/2*l1*l0 < -1):
        q1 = np.arccos(-1)
    q0 = np.arctan(x1/x0) - np.arctan(l1 * np.sin(q1)/(l0 + l1*np.cos(q1)))
    return(q0,q1)
```

```
In [9]: def getIK(q0, q1, delta_x, delta_y):
    """
        Inverse kinematics (using Jacobian Inverse)
        :param q0: Current Central Joint angle
        :param q1: Current Shoulder Joint angle
        :param delta_x: Error in position x
        :param delta_y: Error in position y
        :return: Joint angles
    """

    inv_jacobian = np.linalg.pinv(getJacobian(q0, q1))
    del_pos = np.array([[delta_x], [delta_y]])
    del_q = np.matmul(inv_jacobian, del_pos)

    return del_q
```

```
In [7]: def x_ref(theta):
    """
    Path trajectory
    :param theta: Current theta angle
    :return: position x
    """
    return (0.19 + 0.02 * np.cos(4*theta))*np.cos(theta);

def y_ref(theta):
    """
    Path trajectory
    :param theta: Current theta angle
    :return: position y
    """
    return (0.19 + 0.02 * np.cos(4* theta))*np.sin(theta);

previous_ind = 0
steps = 0
done = False
```

```
In [112]: def mse (referencex , generatedx , referencey , generatedy):
    """
    MSE error
    :param referencex: xreference trajectory
    :param generatedx : xgenerated trajectory
    :param referencey: yreference trajectory
    :param generatedy : ygenerated trajectory
    :return: MSE error
    """
    sum = 0
    for i in range(0, len(referencex)):
        sum = sum + (referencex[i] - generatedx[i]) ** 2 + (referencey[i] - generatedy[i]) ** 2
    return np.sqrt(sum/len(referencex))
```

```
In [113]: def problem_1(k_pos, k_vel, steps = 5000, ini_theta = -np.pi):

    """
    problem_1 trajectory with input as error in end effector position
    :param k_pos: Position error gain value
    :param k_val: Velocity error gain value
    :steps: No of steps to sample
    :param ini_theta: Initial theta
    """
    step = float((np.pi*2)/steps);
    x = []
    y = []
    xref = []
    yref = []

    xref0 = x_ref(-1* np.pi);
    yref0 = y_ref(-1* np.pi);

    env.unwrapped.robot.central_joint.reset_position(0,0);
    env.unwrapped.robot.elbow_joint.reset_position(0,0);

    for theta in np.arange(0,2*np.pi,step):

        k_pos = 25;
        k_vel = 0.9;
        k_pos = np.diag([k_pos, k_pos])
        k_vel = np.diag([k_vel, k_vel])
        q0 , q0dot = env.unwrapped.robot.central_joint.current_position();
        q1 , q1dot = env.unwrapped.robot.elbow_joint.current_position();
        #2*1
        end_effector = getForwardModel(q0,q1);
        x.append(end_effector[0][0]);
        y.append(end_effector[1][0]);
        Jacobian = getJacobian(q0,q1);
        end_effector_vel = np.matmul(Jacobian,np.array([[q0dot],[q1dot]]))

        e_pos = np.array([x_ref(theta)-end_effector[0][0], y_ref(theta)-end_effector[1][0]]).reshape(-1, 1)
        e_vel = np.array([-1 * end_effector_vel[0][0], -1 * end_effector_vel[1][0]]).reshape(-1,1)

        F = np.matmul(k_pos, e_pos) + np.matmul(k_vel, e_vel)
        xref.append(x_ref(theta))
        yref.append(y_ref(theta))

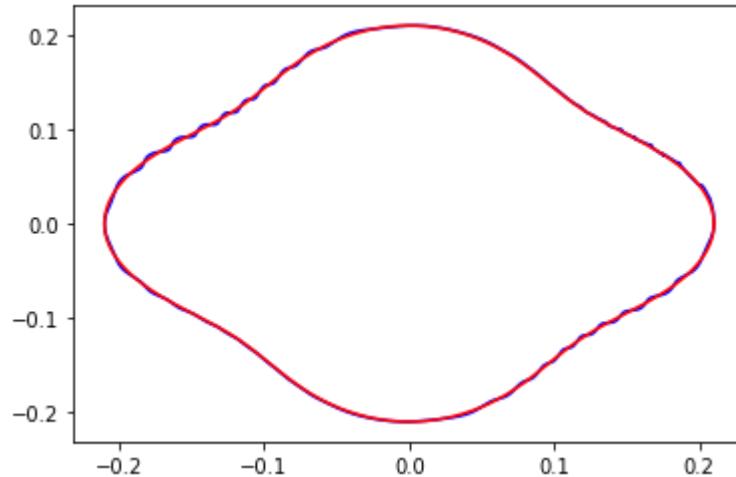
        Torque = np.matmul(Jacobian.T, F);
        action = [Torque[0][0], Torque[1][0]];
        env.step(action)

        print("The MSE error is", mse(xref,x, yref, y))
```

```
plt.plot(x,y, color='b');
plt.plot(xref, yref, color='r')
plt.show()
```

In [114]: `problem_1(k_pos = 15, k_vel = 0.95);`

The MSE error is 0.001333616349497838



```
In [115]: def problem_2(k_pos, k_vel, steps = 5000, ini_theta = -np.pi):
    """
        problem_2 trajectory with input as error in joint angles
        :param k_pos: Angular Position error gain value
        :param k_val: Angular Velocity error gain value
        :steps: No of steps to sample
        :param ini_theta: Initial theta
    """

    step = float((np.pi*2)/steps);
    x = []
    y = []
    xref = []
    yref = [];
    env.unwrapped.robot.central_joint.reset_position(0,0);
    env.unwrapped.robot.elbow_joint.reset_position(0,0);

    for theta in np.arange(0,2*np.pi,step):
        k_pos = 15
        k_val = 0.95

        k_pos = np.diag([k_pos, k_pos])
        k_val = np.diag([k_val, k_val])
        #this gives the joint angles and the joint angle velocity
        q0 , q0dot = env.unwrapped.robot.central_joint.current_position();
        q1 , q1dot = env.unwrapped.robot.elbow_joint.current_position();
        #2*1
        end_effector = getForwardModel(q0,q1);
        Jacobian = getJacobian(q0,q1);
        x.append(end_effector[0][0]);
        y.append(end_effector[1][0]);
        xref.append(x_ref(theta))
        yref.append(y_ref(theta))

        #get the errors
        del_x, del_y = x_ref(theta) - end_effector[0][0], y_ref(theta) - end_effector[1][0]
        angleref_error = getIK(q0 ,q1 , del_x, del_y);
        e_angle = np.array([angleref_error[0][0], angleref_error[1][0]]).reshape(-1, 1)
        e_vel = np.array([-q0dot, -q1dot]).reshape(-1, 1)
        #PD controller
        Torque = np.matmul(k_pos, e_angle) + np.matmul(k_val, e_vel)
    # PD Controller
        Torque = Torque.reshape(-1)
        env.step(Torque)

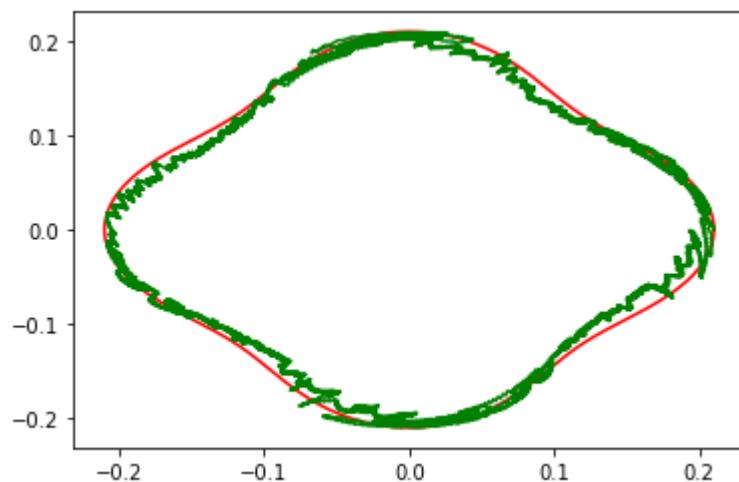
        print("The MSE error is", mse(xref,x, yref, y))

        plt.plot(xref, yref, color='r')
        plt.plot(x,y, color = 'g')

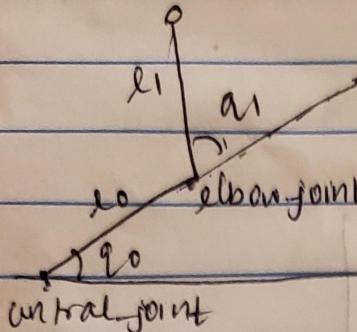
        plt.show()
```

```
In [116]: problem_2(k_pos = 15, k_vel = 0.95)
```

The MSE error is 0.018212144470918967



a1) Forward Kinematics



Suppose the B frame is the one

with origin as elbow joint

$$\therefore \mathbf{v}_B = \begin{bmatrix} l_1 \cos q_1 \\ l_1 \sin q_1 \end{bmatrix}$$

To transform the vector into the A frame with origin
as central joint, the Transformation matrix is

\rightarrow Rotation \rightarrow Translation

$$= \begin{bmatrix} \cos q_0 & -\sin q_0 & l_0 \cos q_0 \\ \sin q_0 & \cos q_0 & l_0 \sin q_0 \\ 0 & 0 & 1 \end{bmatrix}$$

$$= \begin{bmatrix} \cos q_0 & -\sin q_0 & l_0 \cos q_0 \\ \sin q_0 & \cos q_0 & l_0 \sin q_0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} l_1 \cos q_1 \\ l_1 \sin q_1 \\ 1 \end{bmatrix}$$

$$F_x = l_1 \cos(q_0 + q_1) + l_0 \cos q_0$$

$$F_y = l_1 \sin(q_0 + q_1) + l_0 \sin q_0$$

2. Jacobian expression

$$J = \begin{bmatrix} \frac{\partial F_1}{\partial q_0} & \frac{\partial F_1}{\partial q_1} \\ \frac{\partial F_2}{\partial q_0} & \frac{\partial F_2}{\partial q_1} \end{bmatrix}$$

$$= \begin{bmatrix} -l_1 \sin(q_1 + q_0) - l_0 \sin(q_0) & -l_1 \sin(q_1 + q_0) \\ l_1 \cos(q_1 + q_0) + l_0 \cos(q_0) & l_1 \cos(q_1 + q_0) \end{bmatrix}$$

3. For the inverse kinematics equation, we can compute the q_1, q_2 from the (x, y) position of the end effector. The following equations compute the q_0, q_1

$$q_1 = \cos^{-1} \left(\frac{x^2 + y^2 - l_0^2 - l_1^2}{2 l_0 l_1} \right)$$

$$q_0 = \tan^{-1} \left(\frac{y}{x} \right) - \tan^{-1} \left(\frac{l_1 \sin q_1}{l_1 + l_0 \cos q_1} \right)$$

In this case

$$\begin{bmatrix} \Delta x_1 \\ \Delta y_1 \end{bmatrix} = \begin{bmatrix} \frac{\partial F_1}{\partial q_0} & \frac{\partial F_1}{\partial q_1} \\ \frac{\partial F_2}{\partial q_0} & \frac{\partial F_2}{\partial q_1} \end{bmatrix} \begin{bmatrix} \Delta q_0 \\ \Delta q_1 \end{bmatrix}$$

$\underbrace{}_{J}$

Therefore in inverse kinematics, we consider the

$$\Delta x = x_{\text{target}} - x_{\text{current}}$$

$$\Delta y = y_{\text{target}} - y_{\text{current}}$$

$$\begin{bmatrix} \Delta q_0 \\ \Delta q_1 \end{bmatrix} = J^{-1} \begin{bmatrix} \Delta x \\ \Delta y \end{bmatrix}$$

From the initial q_0, q_1 we step to $q_0 + \Delta q_0, q_1 + \Delta q_1$

This is done in steps to get the final q_0 and q_1

In the following question, we take the no. of steps = 2000

4. gains used $K_p = 15$ and $K_d = 0.95$

5. gains used $K_p = 15 \rightarrow K_d = 0.95$

For forward kinematics $\frac{\Delta x_0}{\Delta x_1} = \text{getforwardmode}$

we reset the bot to the initial position. Post that we compute the error with $x_{\text{ref(theta)}} - \text{end-effector}(x)$ and $y_{\text{ref(theta)}} - \text{end-effector}(y)$

$$1.4 \Rightarrow F = \begin{bmatrix} K_p & 0 \\ 0 & K_p \end{bmatrix} \begin{bmatrix} \Delta x \\ \Delta y \end{bmatrix} + \begin{bmatrix} K_d & 0 \\ 0 & K_d \end{bmatrix} \begin{bmatrix} v_x \\ v_y \end{bmatrix}$$

Error in velocity $v_x - v_{x_{\text{ref(theta}}}} - \text{end-effector-vel}(x)$

$v_y - v_{y_{\text{ref(theta}}}} - \text{end-effector-vel}(y)$

$$\text{end eff-vel} = J * \begin{pmatrix} q_0 \dot{q}_0 \\ q_1 \dot{q}_1 \end{pmatrix}$$

$$\boxed{T = J^T F} \quad \text{which is the input.}$$

1.5 \Rightarrow For inverse kinematics, we record the q_0 and q_1 angles

$$\begin{bmatrix} q_0 \\ \Delta q_1 \end{bmatrix} = [J^{-1}] \begin{bmatrix} \Delta x \\ \Delta y \end{bmatrix}, \text{ so corresponding to the } \Delta x \text{ and } \Delta y \text{ we get the error in angle}$$

The error in velocity = $[0 - q_0 \dot{q}_0] + [0 - q_1 \dot{q}_1]$

$$T = \begin{bmatrix} K_p & 0 \\ 0 & K_p \end{bmatrix} \begin{bmatrix} \Delta x \\ \Delta y \end{bmatrix} + \begin{bmatrix} K_d & 0 \\ 0 & K_d \end{bmatrix} \begin{bmatrix} -q_0 \dot{q}_0 \\ q_1 \dot{q}_1 \end{bmatrix}$$