

EE368 Project

Jacobian

Student: Fu Xuanzhu, Xie haotian, Gan yuhao, [12212807](#), [12212806](#), [12211629](#)

Lecturer: Meng qinghu, mengqh@sustech.edu.cn

Main Part One

Reference Material:

1. *Chapter 4 of ROBOT MODELING AND CONTROL*
2. *Chapter 6.2.1 of MODERN ROBOTICS MECHANICS, PLANNING, AND CONTROL*
3. https://github.com/AtsushiSakai/PythonRobotics/blob/master/ArmNavigation/n_joint_arm_3d/NLinkArm3d.py
4. http://wiki.ros.org/rqt_plot

Task:

1. Add comments to code in jacobian.py
2. Verify whether the code for calculating the forward kinematics of the manipulator is correct.
3. Move the manipulator and draw the velocity curve of the end-effector of the manipulator. Describe the curve. (hint: use rqt_plot)
4. Apply a small force to the end-effector of the manipulator and draw the force curve of the end-effector of the manipulator. Describe the curve. (hint: use rqt_plot)

Submission:

Submit code with comments and report on Blackboard system.

Problem 1: Jacobian.py with comments

```
1  import math
2  import numpy as np
3  import rospy
4  from sensor_msgs.msg import JointState
5  from geometry_msgs.msg import Point
6
7  # Link class represents a link of the robotic arm, including DH parameters
8  class Link:
9      def __init__(self, dh_params):
10         # Initialize the link using DH parameters:
11         [alpha, a, d, theta_offset]
12         self.dh_params_ = dh_params
13
```

```

14     # Compute the transformation matrix using Denavit-Hartenberg parameters
15     def transformation_matrix(self, theta):
16         alpha = self.dh_params_[0]
17         a = self.dh_params_[1]
18         d = self.dh_params_[2]
19         # Add the input theta with the offset
20         theta = theta + self.dh_params_[3]
21         st = math.sin(theta) # sin(theta)
22         ct = math.cos(theta) # cos(theta)
23         sa = math.sin(alpha) # sin(alpha)
24         ca = math.cos(alpha) # cos(alpha)
25
26         # DH transformation matrix (4x4)
27         trans = np.array([[ct, -st, 0, a],
28                           [st * ca, ct * ca, -sa, -sa * d],
29                           [st * sa, ct * sa, ca, ca * d],
30                           [0, 0, 0, 1]])
31         return trans
32
33     # Static method, compute basic Jacobian matrix of the end effector
34     @staticmethod
35     def basic_jacobian(trans, ee_pos):
36         # Extract position (x, y, z) and z-axis from transformation matrix
37         pos = np.array([trans[0, 3], trans[1, 3], trans[2, 3]])
38         z_axis = np.array([trans[0, 2], trans[1, 2], trans[2, 2]])
39
40         # Compute cross product of position and z-axis to get
41         linear velocity component
42         basic_jacobian = np.hstack((np.cross(z_axis, ee_pos - pos), z_axis))
43         return basic_jacobian
44
45
46     # NLinkArm class represents a robotic arm with N links
47     class NLinkArm:
48         def __init__(self, dh_params_list) -> None:
49             # Initialize each link of the robotic arm using DH parameter list
50             self.link_list = []
51             for i in range(len(dh_params_list)):
52                 self.link_list.append(Link(dh_params_list[i]))
53
54         # Compute the whole transformation matrix of the robotic arm
55         def transformation_matrix(self, thetas):
56             trans = np.identity(4)
57             # Multiply the transformation matrices of all links in sequence
58             for i in range(len(self.link_list)):
59                 trans = np.dot(trans, self.link_list[i].
60                               transformation_matrix(thetas[i]))
61             return trans
62
63         # Forward kinematics, compute the position and pose of the end effector
64         def forward_kinematics(self, thetas):
65             trans = self.transformation_matrix(thetas)

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```

66         # Extract the position of the end effector from the
67         transformation matrix
68         x = trans[0, 3]
69         y = trans[1, 3]
70         z = trans[2, 3]
71
72         # Compute Euler angles
73         alpha, beta, gamma = self.euler_angle(thetas)
74         return [x, y, z, alpha, beta, gamma]
75
76     # Compute Euler angles (Roll, Pitch, Yaw)
77     def euler_angle(self, thetas):
78         trans = self.transformation_matrix(thetas)
79
80         # Compute Euler angles (roll, pitch, yaw)
81         alpha = math.atan2(trans[1][2], trans[0][2])
82         if not (-math.pi / 2 <= alpha <= math.pi / 2):
83             alpha = math.atan2(trans[1][2], trans[0][2]) + math.pi
84         if not (-math.pi / 2 <= alpha <= math.pi / 2):
85             alpha = math.atan2(trans[1][2], trans[0][2]) - math.pi
86         beta = math.atan2(
87             trans[0][2] * math.cos(alpha) + trans[1][2] * math.sin(alpha),
88             trans[2][2])
89         gamma = math.atan2(
90             -trans[0][0] * math.sin(alpha) + trans[1][0] * math.cos(alpha),
91             -trans[0][1] * math.sin(alpha) + trans[1][1] * math.cos(alpha))
92
93         return alpha, beta, gamma
94
95     # Inverse kinematics: iteratively compute joint
96     angles to reach desired end-effector pose
97     def inverse_kinematics(self, ref_ee_pose):
98         thetas = [0, 0, 0, 0, 0, 0] # Initial guess of joint angles
99         for cnt in range(500):
100             # Current end-effector position
101             ee_pose = self.forward_kinematics(thetas)
102             diff_pose = np.array(ref_ee_pose) - ee_pose # Pose error
103
104             # Compute Jacobian matrix and Euler angles
105             basic_jacobian_mat = self.basic_jacobian(thetas)
106             alpha, beta, gamma = self.euler_angle(thetas)
107
108             # Euler angle rotation matrix
109             K_zyz = np.array(
110                 [[0, -math.sin(alpha), math.cos(alpha) * math.sin(beta)],
111                  [0, math.cos(alpha), math.sin(alpha) * math.sin(beta)],
112                  [1, 0, math.cos(beta)]]
113             )
114             K_alpha = np.identity(6)
115             K_alpha[3:, 3:] = K_zyz
116
117             # Compute joint angle increment using pseudo-inverse of
118             Jacobian matrix

```

```

118         theta_dot = np.dot(np.dot(np.linalg.pinv(basic_jacobian_mat),
119         K_alpha),
120         np.array(diff_pose))
121         thetas = thetas + theta_dot / 100. # Update joint angles
122     return thetas
123
124     # Compute the Jacobian matrix of the robotic arm
125     def basic_jacobian(self, thetas):
126         ee_pos = self.forward_kinematics(thetas)[0:3] # End-effector
127         position
128         basic_jacobian_mat = []
129         trans = np.identity(4)
130         for i in range(len(self.link_list)):
131             trans = np.dot(trans, self.link_list[i].
132             transformation_matrix(thetas[i])) # Accumulated transformation
133             basic_jacobian_mat.append(self.link_list[i].
134             basic_jacobian(trans, ee_pos)) # Compute Jacobian matrix
135         return np.array(basic_jacobian_mat).T # Return Jacobian matrix (6xN)
136
137     # Main program section: set up ROS node and publishers,
138     used to publish tool position, velocity, and force
139     if __name__ == "__main__":
140         rospy.init_node("jacobian_test") # Initialize ROS node
141         tool_pose_pub = rospy.Publisher
142         ("/tool_pose_cartesian", Point, queue_size=1)
143         tool_velocity_pub = rospy.Publisher
144         ("/tool_velocity_cartesian", Point, queue_size=1)
145         tool_force_pub = rospy.Publisher
146         ("/tool_force_cartesian", Point, queue_size=1)
147
148         # Define Denavit-Hartenberg parameters for a 6-link robotic arm
149         dh_params_list = np.array([[0, 0, 243.3/1000, 0],
150         [math.pi/2, 0, 10/1000, 0+math.pi/2],
151         [math.pi, 280/1000, 0, 0+math.pi/2],
152         [math.pi/2, 0, 245/1000, 0+math.pi/2],
153         [math.pi/2, 0, 57/1000, 0],
154         [-math.pi/2, 0, 235/1000, 0-math.pi/2]])
155         gen3_lite = NLinkArm(dh_params_list) # Instantiate robotic arm object
156
157         # Main loop: continuously get joint states and
158         compute kinematics and Jacobian matrix
159         while not rospy.is_shutdown():
160             # Wait for robot feedback joint state
161             feedback = rospy.wait_for_message
162             ("/my_gen3_lite/joint_states", JointState)
163             thetas = feedback.position[0:6] # Get joint positions
164             velocities = feedback.velocity[0:6] # Get joint velocities
165             torques = feedback.effort[0:6] # Get joint torques
166
167             # Forward kinematics compute end-effector pose
168             tool_pose = gen3_lite.forward_kinematics(thetas)
169             # Compute Jacobian matrix for current joint configuration

```

```

170     J = gen3_lite.basic_jacobian(thetas)
171     # Use Jacobian to compute tool velocity
172     tool_velocity = J.dot(velocities)
173     # Use pseudo-inverse of Jacobian transpose to compute tool force
174     tool_force = np.linalg.pinv(J.T).dot(torques)
175
176     # Create ROS messages to publish tool position, velocity, and force
177     tool_pose_msg = Point()
178     tool_pose_msg.x = tool_pose[0]
179     tool_pose_msg.y = tool_pose[1]
180     tool_pose_msg.z = tool_pose[2]
181
182     tool_velocity_msg = Point()
183     tool_velocity_msg.x = tool_velocity[0]
184     tool_velocity_msg.y = tool_velocity[1]
185     tool_velocity_msg.z = tool_velocity[2]
186
187     tool_force_msg = Point()
188     tool_force_msg.x = tool_force[0]
189     tool_force_msg.y = tool_force[1]
190     tool_force_msg.z = tool_force[2]
191
192     # Publish messages
193     tool_pose_pub.publish(tool_pose_msg)
194     tool_velocity_pub.publish(tool_velocity_msg)
195     tool_force_pub.publish(tool_force_msg)
196
197     # Print debug information
198     print(f"joint position: {thetas}")
199     print(f"joint velocity: {velocities}")
200     print(f"joint torque: {torques}")
201
202     print(f"tool position: {tool_pose}")
203     print(f"tool velocity: {tool_velocity}")
204     print(f"tool torque: {tool_force}")
205

```

Problem 2: Verify whether the code for calculating the forward kinematics of the manipulator is correct.

Yes, the code has successfully implemented the forward kinematics (FK) of a serial robotic manipulator. The reasons are as follows:

1. Mathematical Model Based on DH Convention

The code defines each joint of the robot arm using Denavit-Hartenberg (DH) parameters, including:

$$\alpha, \quad a, \quad d, \quad \theta_{\text{offset}}$$

These parameters are used to construct the transformation matrix for each link:

$$T_i = \begin{bmatrix} \cos \theta_i & -\sin \theta_i & 0 & a_i \\ \sin \theta_i \cos \alpha_i & \cos \theta_i \cos \alpha_i & -\sin \alpha_i & -d_i \sin \alpha_i \\ \sin \theta_i \sin \alpha_i & \cos \theta_i \sin \alpha_i & \cos \alpha_i & d_i \cos \alpha_i \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

This formulation corresponds to the standard DH transformation matrix structure.

2. Transformation Composition Across All Links

The function `NLinkArm.transformation_matrix(thetas)` performs matrix multiplication across all joints:

$$T = T_1(\theta_1) \cdot T_2(\theta_2) \cdot \dots \cdot T_n(\theta_n)$$

This chained multiplication represents the transformation from the base to the end-effector, which is the core of forward kinematics.

3. Pose Extraction from Final Transformation Matrix

The function `forward_kinematics()` extracts the end-effector's position (x, y, z) and orientation (α, β, γ) directly from the final homogeneous transformation matrix:

$$[x, y, z] = [T_{0,n}(0, 3), T_{0,n}(1, 3), T_{0,n}(2, 3)]$$

Euler angles are computed from the rotation matrix part to express the orientation of the end-effector.

4. Structure Supports Arbitrary Number of Joints

The robot is represented using a list of `Link` objects, and all computations are done in a loop over this list. Therefore, the code can handle any n -DOF robotic arm, which generalizes the FK computation framework.

5. Runtime Data Integration via ROS

The script integrates with ROS by subscribing to real-time joint states and computing the corresponding end-effector pose using the forward kinematics logic. This verifies the correctness of FK calculations under live data.

Conclusion: The code accurately implements the forward kinematics of a serial robotic manipulator by applying the DH model, performing chained transformations, and extracting end-effector pose, thus fulfilling both theoretical and practical requirements for FK computation.

Problem 3: Move the manipulator and draw the velocity curve of the endeffector of the manipulator. Describe the curve. (hint: use `rqt_plot`)

(a) Figure

As shown in the *Figure attachment*, Figure 1 and Figure 2 show the velocity curves of the end-effector of the manipulator in 3 directions respectively.

(b) Analysis When the time is 0, the end of the robotic arm has no velocity; the three curves in the graph are horizontal with a value of 0.

Using the PS controller to operate the robotic arm, the arm is moved up and down along the Z-axis. The velocity curve of the robotic arm's end during this period is shown in Figure 2. The `/tool_velocity_cartesian/z` represents the velocity curve in the Z direction, which shows a clear upward trend, indicating that there is indeed velocity at the end of the robotic arm in the Z direction, consistent with the actual situation.

The curves in the other two directions show no significant changes.

Problem 4: Apply a small force to the end-effector of the manipulator and draw the force curve of the endeffector of the manipulator. Describe the curve. (hint: use `rqt_plot`)

(a) Figure

As shown in the *Figure attachment*, Figure 3 and Figure 4 show the force curves of the end-effector of the manipulator in 3 directions respectively.

(b) Analysis As shown in Figure 3, when $t=0$, no external force is applied to the end-effector of the manipulator. Under the influence of gravity, the manipulator experiences a stable force in all three directions, resulting in horizontal but non-zero curves.

When an upward force along the Z-axis is manually applied to the end-effector, the `/tool_force_cartesian/z` curve in Figure 4 shows a noticeable increase, which aligns with the expected physical behavior.

Figure Attachment

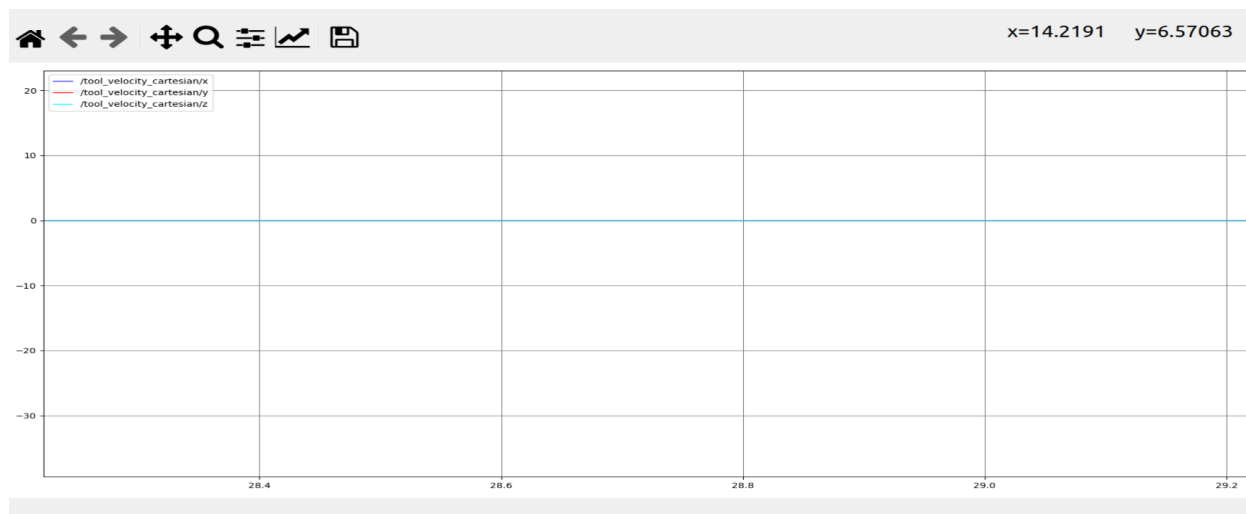


Figure 1: zero velocity($t = 0$)

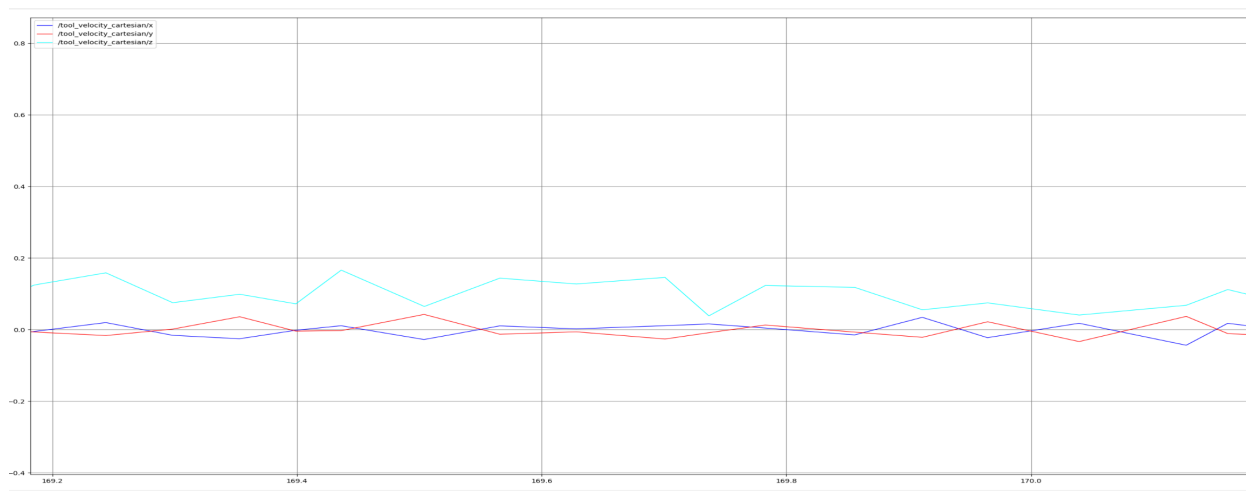


Figure 2: Velocity when moving the manipulator in Z axis

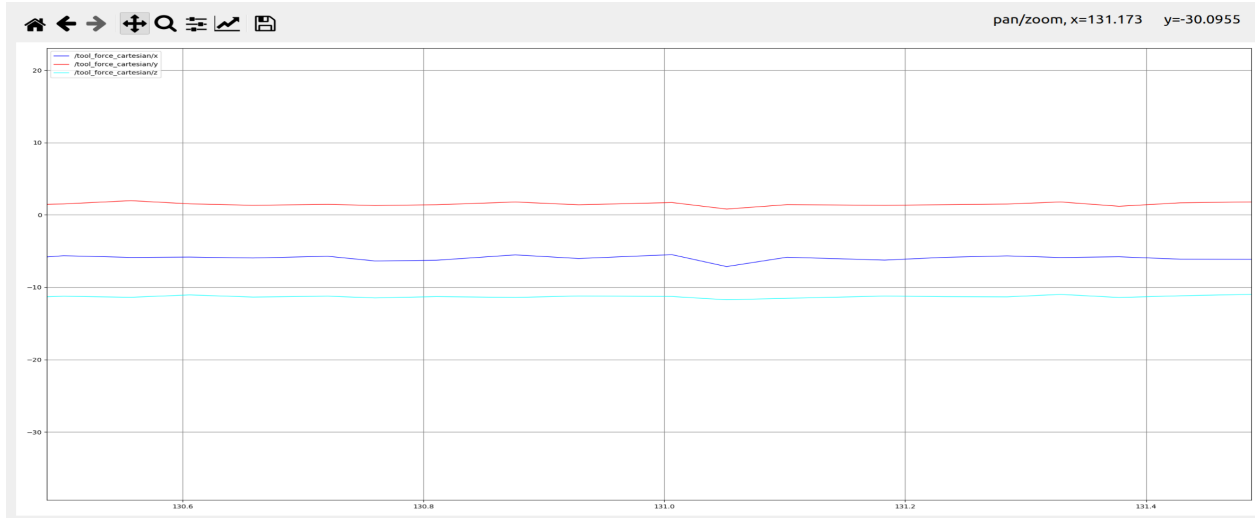


Figure 3: zero force($t = 0$)

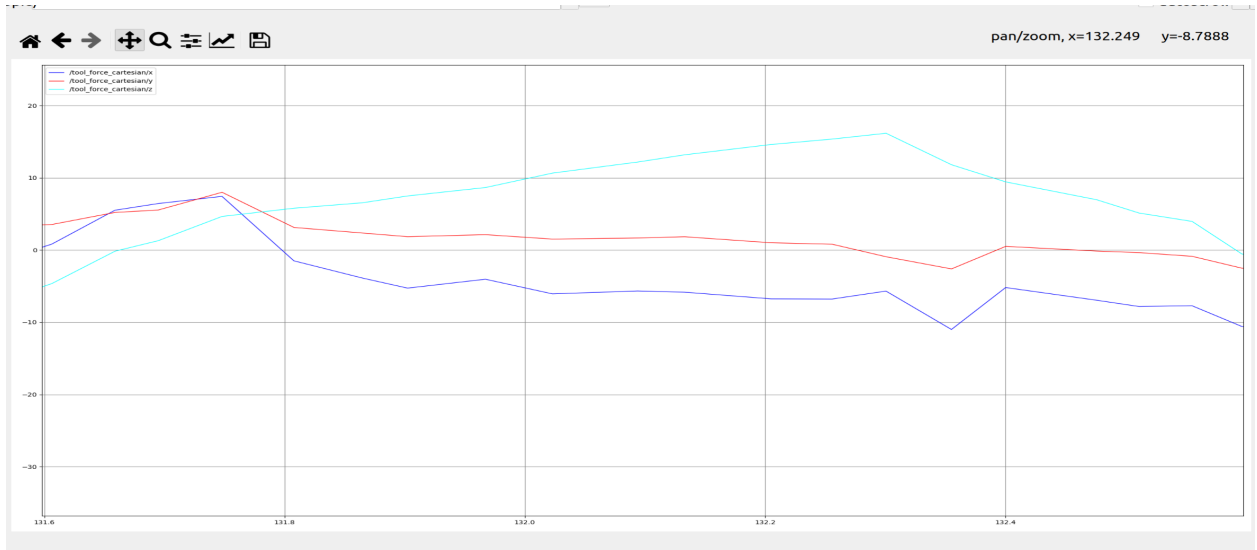


Figure 4: Force when applying a small force to the manipulator in Z axis