

## RBE 595: Vision-based Robotic Manipulation

### Homework 5

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#### Step 1

Deliverable: Present the image taken from the virtual camera, the detected circle centers, and a snapshot of the related part of the code in your report.

Result:

Figure 1 shows the image taken from the virtual camera, the detected circle centers, and their positions.

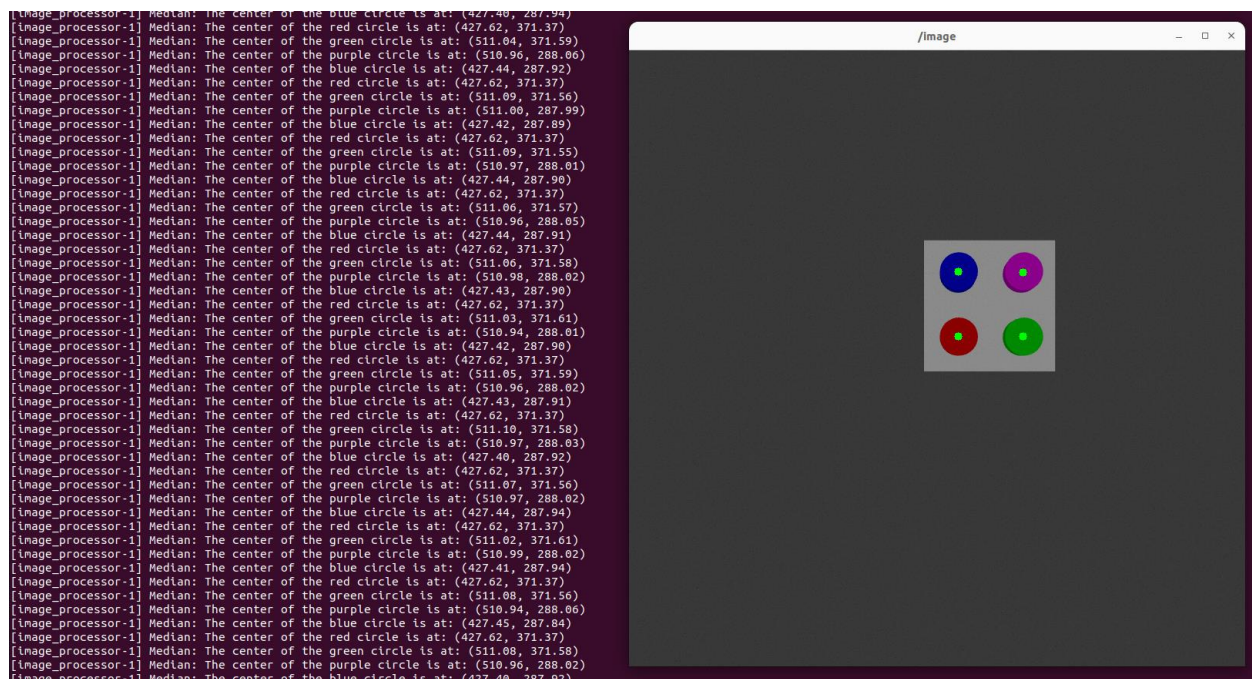


Figure 1: Virtual camera and circle centers and positions

Figure 2 shows the relevant code that implements this functionality. Additional code can be found in `/src/opencv_test_py/opencv_test_py/camera.py`

```
@staticmethod
def find_center(image, lower_range, upper_range, name):
    """
    Function to obtain the center of an image given upper and lower HSV ranges
    """
    # Create a mask for the specified color ranges
    mask = cv2.inRange(image, lower_range, upper_range)

    # Locate the x and y coordinates of all the pixels found in the mask
    pixels = np.column_stack(np.where(mask > 0))

    # Calculate the x and y pixel averages to find the center
    center_x = np.mean(pixels[:, 1])
    center_y = np.mean(pixels[:, 0])
    print(f"Median: The center of the {name} circle is at: ({center_x:.2f}, {center_y:.2f})")

    # Return the center
    return (center_x, center_y)

def find_center_of_colors(self, image):
    """
    Function to find the center of all four circles in the image
    """

    # Convert the image to HSV colorspace
    hsv_image = cv2.cvtColor(image, cv2.COLOR_BGR2HSV)

    # Call the find_center method given an HSV converted image, and the predefined bounds
    red_center = self.find_center(hsv_image, self.lower_red, self.upper_red, 'red')

    green_center = self.find_center(hsv_image, self.lower_green, self.upper_green, 'green')

    purple_center = self.find_center(hsv_image, self.lower_purple, self.upper_purple, 'purple')

    blue_center = self.find_center(hsv_image, self.lower_blue, self.upper_blue, 'blue')

    # Create a list of the centers
    centers = [red_center, green_center, purple_center, blue_center]

    # Loop through centers and add a small circle to visualize its center
    for center in centers:
        cv2.circle(image, (int(center[0]), int(center[1])), 5, (0, 255, 0), -1)

    # Return the updated image
    return image
```

Figure 2: Code to implement Step 1

## Step 2

Deliverable: Present the image taken from the virtual camera, the detected circle centers, and a snapshot of the related part of the code in your report.

Results:

Figure 3 shows the image taken from a different position and the respective circle centers.

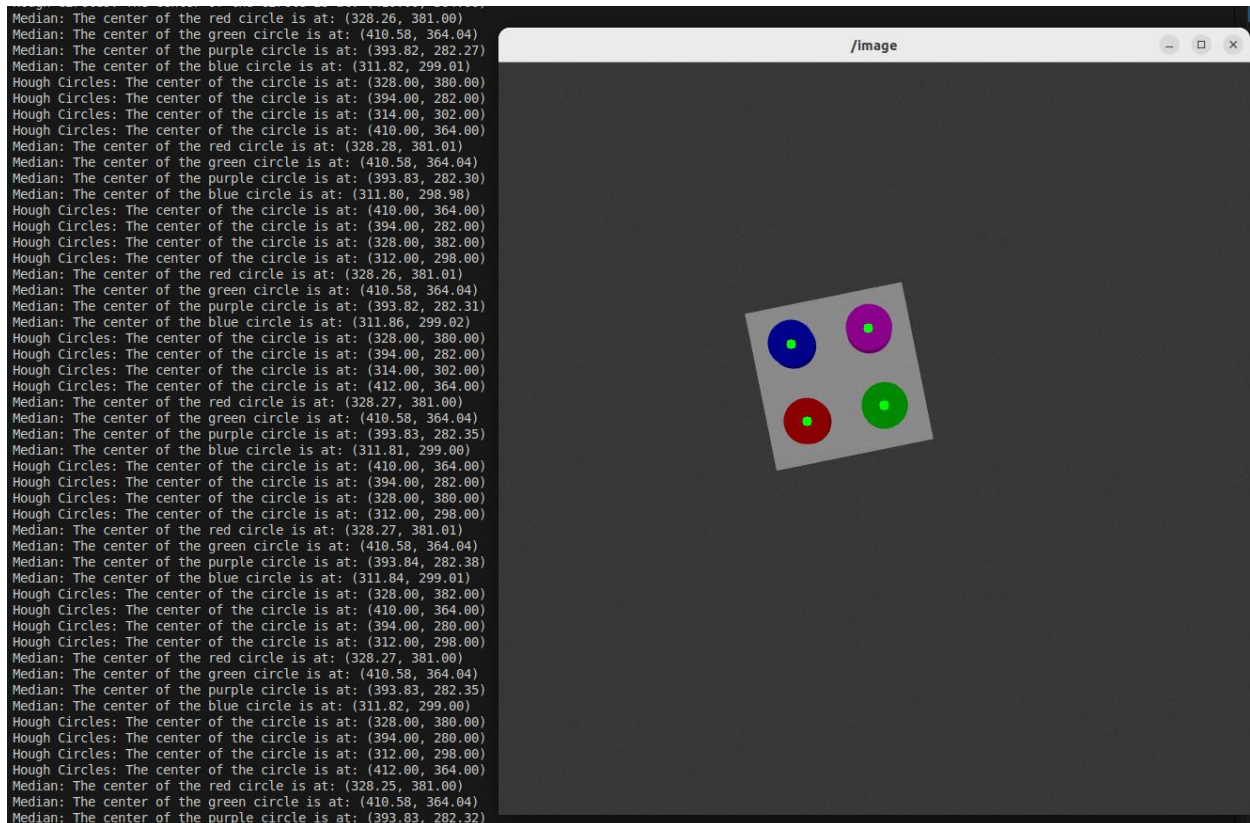


Figure 3: Virtual camera and circle centers and positions

Figure 4 shows the command used to move the camera.

```
> azzam@azzam:~/rbe_595_hw5_submission$ ros2 topic pub /forward_position_controller/commands std_msgs/msg/Float64MultiArray "{data: [0.1, 0.1]}"
publisher: beginning loop
publishing #1: std_msgs.msg.Float64MultiArray(layout=std_msgs.msg.MultiArrayLayout(dim=[], data_offset=0), data=[0.1, 0.1])

publishing #2: std_msgs.msg.Float64MultiArray(layout=std_msgs.msg.MultiArrayLayout(dim=[], data_offset=0), data=[0.1, 0.1])

publishing #3: std_msgs.msg.Float64MultiArray(layout=std_msgs.msg.MultiArrayLayout(dim=[], data_offset=0), data=[0.1, 0.1])

publishing #4: std_msgs.msg.Float64MultiArray(layout=std_msgs.msg.MultiArrayLayout(dim=[], data_offset=0), data=[0.1, 0.1])
```

Figure 4: Command to move the robot

The code shown in Figure 2 is applied to this step as well.

### Step 3

Deliverable: Record the locations (x, y coordinates) of all the features over time during visual servoing. Plot them in the XY plane so that you visualize the trajectories of the features (you can record them in a file and plot in Matlab if you like). Include that plot, a snapshot of your code in your report as well as the ROS package that includes your implementation.

### Results:

A side-by-side view of position 1 to position 2 can be seen in Figure 5.

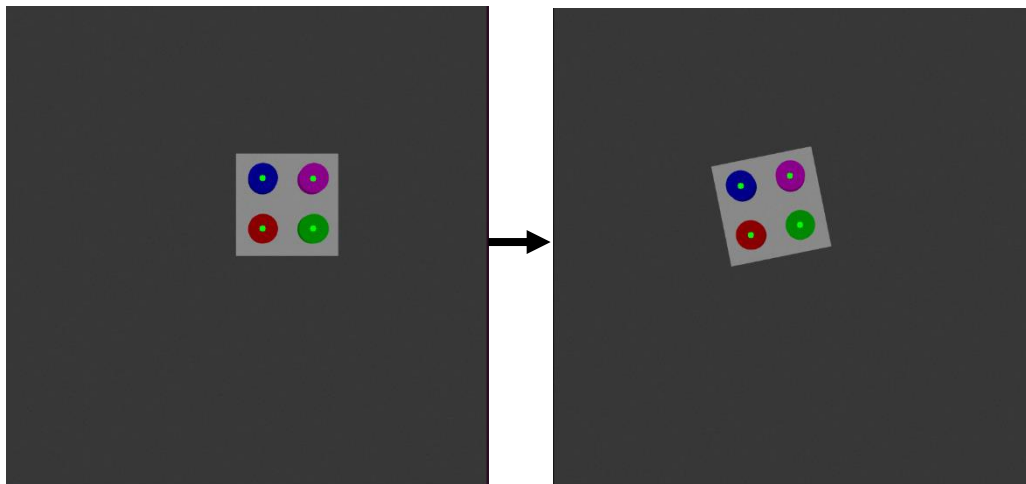


Figure 5: Position 1 to position 2

Figure 6 shows the path taken by each object center to go from position 1 to position 2.

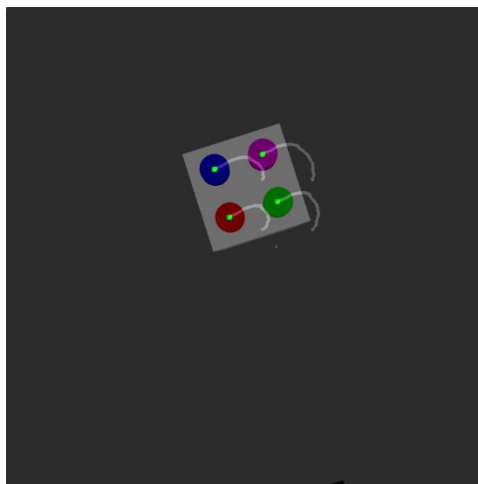


Figure 6: Trajectory over time of the 4 circle centers

A video of the trajectory is available with the submission for reference.

Several snapshots of the code can be seen below. Full implementation can be seen in the /src/ folder and the respective packages.

The feature\_extractor.py function in the opencv\_test\_py package is responsible for obtaining the center of each circle and publishing them as topics. Refer to Figure 7 for reference code.

```
@staticmethod
def find_center(image, lower_range, upper_range, name):
    """
    Function to obtain the center of an image given upper and lower HSV ranges
    """
    # Create a mask for the specified color ranges
    mask = cv2.inRange(image, lower_range, upper_range)

    # Locate the x and y coordinates of all the pixels found in the mask
    pixels = np.column_stack(np.where(mask > 0))

    # In case no pixels are detected, return an empty message
    if len(pixels) == 0:
        msg = Int32MultiArray()
        msg.data = [int(0), int(0)]
        return msg

    # Calculate the x and y pixel averages to find the center
    center_x = np.mean(pixels[:, 1])
    center_y = np.mean(pixels[:, 0])

    # Create the output message that needs to be sent
    msg = Int32MultiArray()
    msg.data = [int(center_x), int(center_y)]

    return msg

def find_center_of_colors(self, image):
    """
    Function to find the center of all four circles in the image
    """
    # Convert the image to HSV colorspace
    hsv_image = cv2.cvtColor(image, cv2.COLOR_BGR2HSV)

    # Call the find_center method given an HSV converted image, and the predefined bounds
    red_center = self.find_center(hsv_image, self.lower_red, self.upper_red, 'red')

    green_center = self.find_center(hsv_image, self.lower_green, self.upper_green, 'green')

    purple_center = self.find_center(hsv_image, self.lower_purple, self.upper_purple, 'purple')

    blue_center = self.find_center(hsv_image, self.lower_blue, self.upper_blue, 'blue')

    # Create a list of the centers
    centers = [red_center, green_center, purple_center, blue_center]

    # Loop through centers and add a small circle to visualize its center
    for center in centers:
        cv2.circle(image, (center.data[0], center.data[1]), 5, (0, 255, 0), -1)

    # Return the updated image
    return centers, image

def listener_callback(self, data):
    """
    Callback function.
    """
    # Convert ROS Image message to OpenCV image
    current_frame = self.br.imgmsg_to_cv2(data)

    # Call the find_center_of_colors to obtain the center of the images
    # Pass a copy of the current frame so the current frame doesn't get modified
    centers, image = self.find_center_of_colors(current_frame.copy())

    output_image = image

    # Publish the image and center topics
    self.publisher_.publish(self.br.cv2_to_imgmsg(output_image, encoding="bgr8"))
    self.red_publisher_.publish(centers[0])
    self.green_publisher_.publish(centers[1])
    self.purple_publisher_.publish(centers[2])
    self.blue_publisher_.publish(centers[3])
```

Figure 7: feature\_extractor.py reference code

The visual\_servoing.py file in the controller package is responsible for computing image Jacobians and determining the camera velocity. Refer to Figure 8 for reference code.

```
def controller_callback(self):
    """
    Controller callback function that computes the camera twist for control
    """

    # Define the list of current positions in meters
    current_poses = [self.get_image_plane_position(self.pixel_pose_red),
                    self.get_image_plane_position(self.pixel_pose_blue),
                    self.get_image_plane_position(self.pixel_pose_green),
                    self.get_image_plane_position(self.pixel_pose_purple)]

    # Define the list of reference positions in meters
    reference_poses = [self.get_image_plane_position(self.ref_red_circle),
                     self.get_image_plane_position(self.ref_blue_circle),
                     self.get_image_plane_position(self.ref_green_circle),
                     self.get_image_plane_position(self.ref_purple_circle)]

    # Compute the error vector (8x1)
    error_vector = self.compute_error_vector(reference_poses, current_poses)

    # Compute the image jacobian (8x6)
    Le = self.get_full_image_Jacobian(current_poses)

    # Compute vr = lambda * pinv(Le) * e [scalar * (6x8) @ (8x1)]
    vr = -0.3*(np.linalg.pinv(Le)@error_vector)

    # If the total error between the different circles is < 0.05, the servoing
    # is complete
    if np.abs(np.sum(error_vector)) < 0.05:
        self.get_logger().info(f"Goal Reached!")
        # Send 0 twist
        msg = Twist()
        msg.linear.x = 0.0
        msg.linear.y = 0.0
        msg.linear.z = 0.0
        msg.angular.x = 0.0
        msg.angular.y = 0.0
        msg.angular.z = 0.0
    else:
        self.get_logger().info(f"Current total error: {np.sum(error_vector)}.")
        # Send vr twist
        msg = Twist()
        msg.linear.x = float(vr[0])
        msg.linear.y = float(vr[1])
        msg.linear.z = float(vr[2])
        msg.angular.x = float(vr[3])
        msg.angular.y = float(vr[4])
        msg.angular.z = float(vr[5])

    # Call the plot function to plot the trajectory
    self.plot_positions([self.pixel_pose_red,
                       self.pixel_pose_blue,
                       self.pixel_pose_green,
                       self.pixel_pose_purple])

    # Publish the twist
    self.controller_publisher_.publish(msg)
```

Figure 8: visual\_servoing.py reference code



The rrobot\_controller.py file in the robot\_controller package is responsible for taking the camera twists and converting them into joint velocities. Refer to Figure 9 for reference code.

```
def twist_callback(self, msg:Twist):
    """
    Function that extract the twist data and create it into a numpy array
    """
    vr = np.empty(6)
    vr[0] = msg.linear.x
    vr[1] = msg.linear.y
    vr[2] = msg.linear.z
    vr[3] = msg.angular.x
    vr[4] = msg.angular.y
    vr[5] = msg.angular.z
    self.vr = vr.reshape((6,1))

def joint_states_callback(self, msg:JointState):
    """
    Function that gets the current joint positions and jacobian
    """

    # Get current joint positions
    current = msg.position
    j1 = current[0]
    j2 = current[1]

    # Predefine variables for the matrix
    l1, l2 = 1,1
    J00 = l1*np.sin(j1)-l2*np.sin(j1+j2)
    J01 = -l2*np.sin(j1+j2)
    J10 = l1*np.cos(j1)+l2*np.cos(j1+j2)
    J11 = l2*np.cos(j1+j2)

    # Create the Jacobian
    self.jacobian = np.array([[J00, J01],
                              [J10, J11],
                              [0, 0],
                              [0, 0],
                              [0, 0],
                              [1, 1]])

    # Publish joint commands from below
    self.send_joint_commands()

def send_joint_commands(self):
    """
    Function to publish the joint commands
    """

    # Compute joint commands
    joint_cmds = (np.linalg.pinv(self.jacobian)@self.vr).flatten()
    # self.get_logger().info(f"Sending joint commands: {joint_cmds}")

    # Convert the joint commands to appropriate data format
    self.msg.data = [float(joint_cmds[0]), float(joint_cmds[1])]

    # Publish the message
    self.publisher_.publish(self.msg)
```

Figure 9: rrobot\_controller.py reference code

Run instructions are available with the submission for reference.