

```

1  import numpy as np
2  import math
3
4  class Quaternion:
5      def __init__(self, scalar=1, vec=[0,0,0]):
6          self.q = np.array([scalar, 0., 0., 0.])
7          self.q[1:4] = vec
8
9      def normalize(self):
10         self.q = self.q/np.linalg.norm(self.q)
11
12     def scalar(self):
13         return self.q[0]
14
15     def vec(self):
16         return self.q[1:4]
17
18     def axis_angle(self):
19         theta = 2*math.acos(np.clip(self.q[0], -1.0, 1.0))
20         vec = self.vec()
21         if (np.linalg.norm(vec) == 0):
22             return np.zeros(3)
23         vec = vec/np.linalg.norm(vec)
24         return vec*theta
25
26     def euler_angles(self):
27         phi = math.atan2(2*(self.q[0]*self.q[1]+self.q[2]*self.q[3]), \
28             1 - 2*(self.q[1]**2 + self.q[2]**2))
29         theta = math.asin(2*(self.q[0]*self.q[2] - self.q[3]*self.q[1]))
30         psi = math.atan2(2*(self.q[0]*self.q[3]+self.q[1]*self.q[2]), \
31             1 - 2*(self.q[2]**2 + self.q[3]**2))
32         return np.array([phi, theta, psi])
33
34     def from_axis_angle(self, a):
35         angle = np.linalg.norm(a)
36         if angle != 0:
37             axis = a/angle
38         else:
39             axis = np.array([1,0,0])
40         self.q[0] = math.cos(angle/2)
41         self.q[1:4] = axis*math.sin(angle/2)
42         #self.normalize()
43
44     def from_rotm(self, R):
45         theta = math.acos(np.clip((np.trace(R)-1)/2, -1.0, 1.0))
46         if (np.abs(theta) < 1e-2):
47             omega = np.array([0.0, 0.0, 0.0])
48         else:
49             omega_hat = (R - np.transpose(R))/(2*math.sin(theta))
50             omega = np.array([omega_hat[2,1], -omega_hat[2,0], omega_hat[1,0]])
51         self.q[0] = math.cos(theta/2)
52         self.q[1:4] = omega*math.sin(theta/2)
53         self.normalize()
54
55     def inv(self):
56         q_inv = Quaternion(self.scalar(), -self.vec())
57         q_inv.normalize()
58         return q_inv
59

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60     #Implement quaternion multiplication
61     def __mul__(self, other):
62         t0 = self.q[0]*other.q[0] - \
63             self.q[1]*other.q[1] - \
64             self.q[2]*other.q[2] - \
65             self.q[3]*other.q[3]
66         t1 = self.q[0]*other.q[1] + \
67             self.q[1]*other.q[0] + \
68             self.q[2]*other.q[3] - \
69             self.q[3]*other.q[2]
70         t2 = self.q[0]*other.q[2] - \
71             self.q[1]*other.q[3] + \
72             self.q[2]*other.q[0] + \
73             self.q[3]*other.q[1]
74         t3 = self.q[0]*other.q[3] + \
75             self.q[1]*other.q[2] - \
76             self.q[2]*other.q[1] + \
77             self.q[3]*other.q[0]
78         retval = Quaternion(t0, [t1, t2, t3])
79         return retval
80
81     def __str__(self):
82         return str(self.scalar()) + ', ' + str(self.vec())
83
84
85 import math
86 import numpy as np
87
88 # from quaternion import Quaternion
89 from matplotlib import pyplot as plt
90 from scipy import io
91 from scipy.stats import linregress
92
93
94 def time_sync(imu_ts, vicon_ts, vicon_rots, accel, gyro):
95     # Synchronize time stamps between vicon and IMU
96     # For each timestamp in IMU, find the closest timestamp in Vicon
97     vicon_idx = 0
98     vicon_rots_synced = []
99     accel_synced = []
100     gyro_synced = []
101     time_diff_threshold = 0.01
102     sync_times = []
103     for i in range(len(imu_ts)):
104         while vicon_idx < len(vicon_ts) and vicon_ts[vicon_idx] < imu_ts[i]:
105             vicon_idx += 1
106         if vicon_idx < len(vicon_ts) and abs(vicon_ts[vicon_idx] - imu_ts[i]) <
time_diff_threshold:
107             vicon_rots_synced.append(vicon_rots[vicon_idx])
108             accel_synced.append(accel[:,i])
109             gyro_synced.append(gyro[:,i])
110             sync_times.append(imu_ts[i])
111     print(f"Number of synced time stamps: {len(sync_times)}")
112     return np.array(vicon_rots_synced), np.array(accel_synced).T,
np.array(gyro_synced).T, sync_times
113
114
115 def plot_and_log_data(vicon_rots, accel, gyro):
116     print('vicon_rots.shape: ', vicon_rots.shape)
117     print('accel.shape: ', accel.shape)
118     print('gyro.shape: ', gyro.shape)

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119
120 vicon_roll = np.zeros(vicon_rots.shape[0])
121 vicon_pitch = np.zeros(vicon_rots.shape[0])
122 vicon_yaw = np.zeros(vicon_rots.shape[0])
123 for i in range(len(vicon_rots)):
124     vicon_rot = vicon_rots[i].reshape((3,3))
125     q_vicon = Quaternion()
126     q_vicon.from_rotm(vicon_rot)
127     roll, pitch, yaw = q_vicon.euler_angles()
128     vicon_roll[i] = roll
129     vicon_pitch[i] = pitch
130     vicon_yaw[i] = yaw
131
132 # Plot vicon data
133 plt.plot(vicon_roll, label='vicon_roll')
134 plt.plot(vicon_pitch, label='vicon_pitch')
135 plt.plot(vicon_yaw, label='vicon_yaw')
136 plt.legend()
137
138
139 def calibrate_accel(vicon_rots, accel):
140     max_T = len(vicon_rots)
141     imu_ax_X = np.zeros((max_T, 2))
142     imu_ax_b = np.zeros(max_T)
143
144     imu_ay_X = np.zeros((max_T, 2))
145     imu_ay_b = np.zeros(max_T)
146
147     imu_az_X = np.zeros((max_T, 2))
148     imu_az_b = np.zeros(max_T)
149     for i in range(max_T):
150         # In world frame - accn = [0, 0, 9.81]
151         # Convert to body frame
152         accn_body_frame = np.dot(vicon_rots[i].reshape((3,3)).T, np.array([0,
0, 9.81]))
153
154         # Convert body frame to IMU frame -> ax, and ay are reverse in IMU
frame
155         imu_ax = -accn_body_frame[0]
156         imu_ay = -accn_body_frame[1]
157         imu_az = accn_body_frame[2]
158
159         # This will act as a value for IMU's accelerometer
160         imu_ax_X[i] = [(1023 * imu_ax) / (3300), 1]
161         imu_ax_b[i] = accel[0][i]
162
163         imu_ay_X[i] = [(1023 * imu_ay) / (3300), 1]
164         imu_ay_b[i] = accel[1][i]
165
166         imu_az_X[i] = [(1023 * imu_az) / (3300), 1]
167         imu_az_b[i] = accel[2][i]
168
169     # Least squares method
170     fit_ax = np.linalg.lstsq(imu_ax_X, imu_ax_b, rcond=None)
171     fit_ay = np.linalg.lstsq(imu_ay_X, imu_ay_b, rcond=None)
172     fit_az = np.linalg.lstsq(imu_az_X, imu_az_b, rcond=None)
173
174     accel_bias = np.array([fit_ax[0][1], fit_ay[0][1], fit_az[0][1]])
175     accel_sensitivity = np.array([fit_ax[0][0], fit_ay[0][0], fit_az[0][0]])
176     print(f"accel_bias: {np.round(accel_bias, 2)}")
177     print(f"accel_sensitivity: {np.round(accel_sensitivity, 2)}")

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178
179
180 def compute_derivative(times, angles, window_length=3, name='pitch'):
181     """
182     Compute the slope of a time series of angles using a running mean filter
183     and linear regression.
184
185     Parameters:
186     times (array-like): Timestamps for each measurement
187     angles (array-like): Angles to compute slope for
188     window_length (int): Number of points to use in running mean
189
190     Returns:
191     computed_slope (float): Slope of the angle data
192     """
193     # Convert inputs to numpy arrays
194     times = np.array(times)
195     angles = np.array(angles)
196
197     # Ensure window_length is odd
198     if window_length % 2 == 0:
199         window_length += 1
200
201     smoothed_angles = np.convolve(angles, np.ones(window_length) /
window_length, mode='valid')
202     angles = angles[:len(smoothed_angles)]
203     times = times[:len(smoothed_angles)]
204
205     # Compute pitch derivative
206     angles_derivative = np.diff(smoothed_angles) / np.diff(times)
207
208     # Compute slope using linear regression best fit line
209     slope, intercept, r_value, p_value, std_err = linregress(times,
smoothed_angles)
210     computed_slope = slope
211
212     # Create visualization
213     plt.figure(figsize=(12, 6))
214     plt.subplot(2, 1, 1)
215     plt.plot(times, angles, 'b-', label='Original Pitch', alpha=0.5)
216     plt.plot(times, smoothed_angles, 'r-', label='Smoothed Pitch')
217     plt.legend()
218     plt.title(f"{name.capitalize()} Angle")
219     plt.xlabel('Time')
220     plt.ylabel('Angle (radians)')
221
222     plt.subplot(2, 1, 2)
223     plt.plot(times[:-1], angles_derivative, 'g-', label=f"{name.capitalize()}
Derivative')
224     plt.axhline(y=computed_slope, color='r', linestyle='--',
225                 label=f'Slope of regression line: {computed_slope:.2f}')
226     plt.legend()
227     plt.title(f"{name.capitalize()} Angle Derivative")
228     plt.xlabel('Time')
229     plt.ylabel(f"{name.capitalize()} Rate (radians/s)")
230
231     plt.tight_layout()
232     return computed_slope
233
234 def compute_gyro_sensor_sensitivity(constant_angular_velocity,
unbiased_readings):

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235 """
236     Compute the sensitivity of a gyroscope sensor using a known constant
angular velocity.
237
238     Parameters:
239     constant_angular_velocity (float): Known constant angular velocity in
radians per second
240     unbiased_readings (array-like): Unbiased gyroscope readings
241
242     Returns:
243     computed_sensitivity (float): Sensitivity of the gyroscope sensor
244 """
245 # Compute the mean of the unbiased gyroscope readings
246 mean_gyro = np.mean(unbiased_readings)
247
248 # Compute the sensitivity of the gyroscope sensor
249 computed_sensitivity = (3300 * mean_gyro) / (1023 *
constant_angular_velocity)
250 return computed_sensitivity
251
252
253 def calibrate_gyro(vicon_euler_angles, gyro, timestamps):
254     # For gyro bias, we can use the fact that initially the drone is at rest
255     # So, the gyro readings should be zero
256     gyro_bias = np.mean(gyro[:, 0:20], axis=1)
257     print(f"gyro_bias (roll, pitch, yaw): {gyro_bias}")
258
259     # Compute gyro unbiased readings
260     gyro_unbiased = gyro - gyro_bias[:, np.newaxis]
261
262     # For sensitivity, we will choose a time period where the drone is rotating
at a constant rate
263     constant_pitch_range = [2100, 2150]
264     constant_pitch_times =
timestamps[constant_pitch_range[0]:constant_pitch_range[1]]
265     constant_pitch =
vicon_euler_angles[constant_pitch_range[0]:constant_pitch_range[1], 1]
266     pitch_rate = compute_derivative(constant_pitch_times, constant_pitch,
name='pitch')
267     pitch_sensitivity = compute_gyro_sensor_sensitivity(pitch_rate,
gyro_unbiased[1, constant_pitch_range[0]:constant_pitch_range[1]])
268
269     # Compute roll sensitivity
270     constant_roll_range = [3250, 3300]
271     constant_roll_times =
timestamps[constant_roll_range[0]:constant_roll_range[1]]
272     constant_roll =
vicon_euler_angles[constant_roll_range[0]:constant_roll_range[1], 0]
273     roll_rate = compute_derivative(constant_roll_times, constant_roll,
name='roll')
274     roll_sensitivity = compute_gyro_sensor_sensitivity(roll_rate,
gyro_unbiased[0, constant_roll_range[0]:constant_roll_range[1]])
275
276     # Compute yaw sensitivity
277     # We don't have any good estimate of yaw rate, so we will use the average
of roll and pitch sensitivities
278     yaw_sensitivity = (roll_sensitivity + pitch_sensitivity) / 2
279
280     print(f"Gyro sensitivities (mv/(rad/s)), (roll, pitch, yaw):
{roll_sensitivity:.2f}, {pitch_sensitivity:.2f}, {yaw_sensitivity:.2f}")
281

```

```
282
283 def calibrate_sensors(data_num=1):
284     #load data
285     imu = io.loadmat('data/imu/imuRaw'+str(data_num)+'.mat')
286     vicon = io.loadmat('data/vicon/viconRot'+str(data_num)+'.mat')
287     vicon_ts = vicon['ts'][0]
288     vicon_rots = vicon['rots'].transpose((2,0,1))
289     accel = imu['vals'][0:3,:]
290     gyro = imu['vals'][3:6,:]
291     T = np.shape(imu['ts'])[1]
292
293     # Synchronize time stamps between vicon and IMU
294     imu_ts = imu['ts'][0]
295     vicon_ts = vicon['ts'][0]
296     vicon_rots, accel, gyro, sync_times = time_sync(imu_ts, vicon_ts,
vicon_rots, accel, gyro)
297
298     # Plot and log data
299     plot_and_log_data(vicon_rots, accel, gyro)
300
301     # Calibrate accelerometer
302     print()
303     calibrate_accel(vicon_rots, accel)
304
305     # Fix ordering of gyro data 0 its given as Wz, Wx, Wy
306     gyro = np.array([gyro[1], gyro[2], gyro[0]])
307
308     # Vicon euler angles
309     euler_angles = []
310     for i in range(len(vicon_rots)):
311         q = Quaternion()
312         q.from_rotm(vicon_rots[i])
313         roll, pitch, yaw = q.euler_angles()
314         euler_angles.append([roll, pitch, yaw])
315     euler_angles = np.array(euler_angles)
316
317     # Calibrate gyroscope
318     print()
319     calibrate_gyro(euler_angles, gyro, sync_times)
320
321     plt.show()
322
323
324 if __name__ == '__main__':
325     calibrate_sensors(1)
326
327
328
329
330
331
```