
Table of Contents

PROBLEM 6	1
Local gravitational acceleration	2
Accelerometers	2
Rate gyros	2
Magnetometers	3
Remove bias	3
Initial Pitch, Roll, and Yaw	3
Final Pitch, Roll, Yaw	4
EKF	5
Function definitions	7

PROBLEM 6

```
clear variables; close all; clc

data_table_acc = readtable('Accelerometer_exp6.csv');

data_table_gyro = readtable('Gyroscope_exp6');

data_table_gps = readtable('Location_exp6');

data_table_mag = readtable('Magnetometer_exp6');
%=====

% CORRECT VALUES FOR THESE BIASES AND VARIANCES AS COMPUTED IN
% EXPERIMENT 1
bias_acc = [1.948244;
            1.926003;
            -3.76083]; % biases in accelerometer x,y,z

bias_mag = [-12.11214937;
            -19.67616054;
            22.73696197]; % biases in magnetometer x,y,z

bias_gyro = [0.00001194560806;
            -0.00000912316961;
            -0.00000169621783]; % biases in gyro x,y,z
var_acc = [4.94; 5.23; 13.5]*10^-5;
var_gyro = [2.1; 2.6; 4.9]*10^-6;
var_mag = [0.467657; 0.744017; 0.463155];

var_mag_heading = 1.3227*10^-5;

Warning: Column headers from the file were
modified to make them valid MATLAB
```

identifiers before creating variable names for the table. The original column headers are saved in the VariableDescriptions property.

Set 'PreserveVariableNames' to true to use the original column headers as table variable names.

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Local gravitational acceleration

```
g = 9.80333; % m/s/s
```

Accelerometers

```
time_stamps_acc = data_table_acc(:, 1);  
acc_x = data_table_acc(:, 2);  
acc_y = data_table_acc(:, 3);  
acc_z = data_table_acc(:, 4);
```

Rate gyros

```
time_stamps_gyro = data_table_gyro(:, 1);  
gyro_x = data_table_gyro(:, 2);  
gyro_y = data_table_gyro(:, 3);  
gyro_z = data_table_gyro(:, 4);
```

Magnetometers

```
time_stamps_mag = data_table_mag(:, 1);  
mag_xb = data_table_mag(:, 2);  
mag_yb = data_table_mag(:, 3);  
mag_zb = data_table_mag(:, 4);
```

Remove bias

```
acc_x_wo_bias = acc_x - bias_acc(1);  
acc_y_wo_bias = acc_y - bias_acc(2);  
acc_z_wo_bias = acc_z - bias_acc(3);  
  
gyro_x_wo_bias= gyro_x - bias_gyro(1);  
gyro_y_wo_bias= gyro_y - bias_gyro(2);  
gyro_z_wo_bias= gyro_z - bias_gyro(3);  
  
mag_xb_wo_bias = mag_xb - bias_mag(1);  
mag_yb_wo_bias = mag_yb - bias_mag(2);  
mag_zb_wo_bias = mag_zb - bias_mag(3);
```

Initial Pitch, Roll, and Yaw

```
initial_few_pts = 5;  
roll_data = atan( acc_y_wo_bias(1:initial_few_pts) ./  
    acc_z_wo_bias(1:initial_few_pts) );  
pitch_data = asin( acc_x_wo_bias(1:initial_few_pts) / g );  
  
initial_roll = mean( roll_data )  
initial_pitch = mean( pitch_data )  
  
tmp1 = [...  
    cos(initial_pitch) sin(initial_pitch)*sin(initial_roll)  
    sin(initial_pitch)*cos(initial_roll); ...  
    0 cos(initial_roll) -sin(initial_roll); ...  
    -sin(initial_pitch) cos(initial_pitch)*sin(initial_roll)  
    cos(initial_pitch)*cos(initial_roll)] * ...  
    [mag_xb_wo_bias(1:initial_few_pts)'; ...  
    mag_yb_wo_bias(1:initial_few_pts)';  
    mag_zb_wo_bias(1:initial_few_pts)'];  
  
mag_x_wo_bias = tmp1(1,:);  
mag_y_wo_bias = tmp1(2,:);  
  
magnetic_heading_data = -atan2( mag_y_wo_bias, mag_x_wo_bias );  
declination = -14.07*pi/180;  
% Declination for Worcester, MA found using World Magnetic Model  
% https://www.ngdc.noaa.gov/geomag/calculators/  
magcalc.shtml#declination  
  
true_heading_data = declination + magnetic_heading_data;  
initial_yaw = mean(true_heading_data)
```

```
initial_roll =
```

```
-0.0303
```

```
initial_pitch =
```

```
-0.1781
```

```
initial_yaw =
```

```
-0.3886
```

Final Pitch, Roll, Yaw

```
Final_few_pts = (670:679);
roll_data_f = atan( acc_y_wo_bias(Final_few_pts) ./
    acc_z_wo_bias(Final_few_pts) );
pitch_data_f = asin( acc_x_wo_bias(Final_few_pts) / g );

final_roll = mean( roll_data_f )
final_pitch = mean( pitch_data_f )

tmp2 = [...
    cos(final_pitch) sin(final_pitch)*sin(final_roll)
    sin(final_pitch)*cos(final_roll); ...
    0 cos(final_roll) -sin(final_roll); ...
    -sin(final_pitch) cos(final_pitch)*sin(final_roll)
    cos(final_pitch)*cos(final_roll)] * ...
    [mag_xb_wo_bias(Final_few_pts)'; ...
    mag_yb_wo_bias(Final_few_pts)'; mag_zb_wo_bias(Final_few_pts)'];

mag_x_wo_bias_f = tmp2(1,:)';
mag_y_wo_bias_f = tmp2(2,:)';

magnetic_heading_data_f = -atan2( mag_y_wo_bias_f, mag_x_wo_bias_f );
declination = -14.07*pi/180;
% Declination for Worcester, MA found using World Magnetic Model
% https://www.ngdc.noaa.gov/geomag/calculators/
% magcalc.shtml#declination

true_heading_data_f = declination + magnetic_heading_data_f;
final_yaw = mean(true_heading_data_f)

final_roll =

-0.0889
```

```
final_pitch =
```

```
-0.1922
```

```
final_yaw =
```

```
-0.0673
```

EKF

```
Q = diag(var_gyro);
R = diag([var_acc; var_mag_heading]);

dt = 0.01;
m1 = 1;
t = max([time_stamps_acc(1), time_stamps_mag(1),
        time_stamps_gyro(1)]);
tfinal = min([time_stamps_acc(end), time_stamps_mag(end),
             time_stamps_gyro(end)]);
n_time_pts = round( tfinal /dt );

initial_few_points = 10;
final_few_points = 10;
gps_lat_init = mean( data_table_gps{1:initial_few_points, 2} );
gps_long_init = mean( data_table_gps{1:initial_few_points, 3} );
gps_lat_final = mean( data_table_gps{(end-final_few_points):end,
                                     2} );
gps_long_final = mean( data_table_gps{(end-final_few_points):end,
                                     3} );

pos_fin = lla2flat([gps_lat_final gps_long_final 0], ...
                  [gps_lat_init gps_long_init], 0, 0);
displacement_gps = norm(pos_fin);
V_loc = displacement_gps / (data_table_gps{end, 1} - data_table_gps{1,
1});
V_gps = mean( data_table_gps{(data_table_gps{:, 6} > 0), 5} );
V = (V_gps + V_loc)/2;

xhat = [initial_yaw; initial_pitch; initial_roll];
P = diag([var_mag_heading var_acc(1) var_acc(2)]);

time_stamps_store = zeros(1, n_time_pts);
xhat_store = zeros(3, n_time_pts);
P_store = zeros(9, n_time_pts);
P_trace_store = zeros(1, n_time_pts);

xhat_store(:, 1) = xhat;
P_trace_store(:, 1) = trace(P);
P_store(:, 1) = reshape(P, 9, 1);
```

```

while (t < tfinal)

col_gyro = find(time_stamps_gyro <= t, 1, 'last');
col_acc = find(time_stamps_acc <= t, 1, 'last');
col_mag = find(time_stamps_mag <= t, 1, 'last');
t = t + dt;

u = [gyro_x_wo_bias(col_gyro); gyro_y_wo_bias(col_gyro);
gyro_z_wo_bias(col_gyro)];

psi_hat = xhat(1);
theta_hat = xhat(2);
phi_hat = xhat(3);
A = [[0;0;0] ...
[ 0 sin(phi_hat)*tan(theta_hat)*sec(theta_hat)
sin(phi_hat)*tan(theta_hat)*sec(theta_hat); ...
0 0 0;...
0 sin(phi_hat)*sec(theta_hat)^2
cos(phi_hat)*sec(theta_hat)^2 ]*u ...
[ 0 cos(phi_hat)*sec(theta_hat) -sin(phi_hat)*sec(theta_hat); ...
0 -sin(phi_hat) -cos(phi_hat); ...
0 cos(phi_hat)*tan(theta_hat) sin(phi_hat)*tan(theta_hat)]*u];
B2 = [...
0 sin(phi_hat)*sec(theta_hat) cos(phi_hat)*sec(theta_hat); ...
0 cos(phi_hat) -sin(phi_hat); ...
1 sin(phi_hat)*tan(theta_hat) cos(phi_hat)*tan(theta_hat)];
C = [[0;0;0;1] ...
[V*[0 cos(theta_hat) 0; -cos(theta_hat) 0 -sin(theta_hat); 0
sin(theta_hat) 0]*u + ...
g*[cos(theta_hat); sin(theta_hat)*sin(phi_hat);
sin(theta_hat)*cos(phi_hat)]; 0] ...
g*[0; -cos(theta_hat)*cos(phi_hat); cos(theta_hat)*sin(phi_hat);
0]];

F = eye(3) + A*dt;
G2 = B2*dt;

tmp1 = [...
cos(theta_hat) sin(theta_hat)*sin(phi_hat)
sin(theta_hat)*cos(phi_hat); ...
0 cos(phi_hat) -sin(phi_hat); ...
-sin(theta_hat) cos(theta_hat)*sin(phi_hat)
cos(theta_hat)*cos(phi_hat)] * ...
[mag_xb_wo_bias(col_mag); mag_yb_wo_bias(col_mag);
mag_zb_wo_bias(col_mag)];

mag_x_wo_bias = tmp1(1);
mag_y_wo_bias = tmp1(2);

magnetic_heading_data = -atan2( mag_y_wo_bias, mag_x_wo_bias );
magnetometer_yaw = declination + magnetic_heading_data;

x_minus = xhat + attitude_kinematics_asg3(xhat, u)*dt;

```

```

P_minus = F*P*F' + G2*Q*G2';

L = (P_minus * C') / (C * P_minus * C' + R );
z = [acc_x_wo_bias(col_acc); ...
     acc_y_wo_bias(col_acc); acc_z_wo_bias(col_acc); ...
     magnetometer_yaw];
xhat = x_minus + L*(z - attitude_measurement_asg3(xhat, u, V));
P = (eye(3) - L*C)*P_minus;

time_stamps_store(m1 + 1) = t;
xhat_store(:, m1+1) = xhat;
P_store(:, m1+1) = reshape(P, 9, 1);
P_trace_store(:, m1+1) = trace(P);

m1 = m1 + 1;
end

figure;
subplot(311)
plot(time_stamps_store(1:m1), xhat_store(1, 1:m1)*180/pi, 'LineWidth',
     2);
ylabel('$\psi$ (deg)', 'Interpreter', 'latex', 'FontSize', 14)
xlabel('$t$ (s)', 'Interpreter', 'latex', 'FontSize', 14)
title('Problem 6 Ground Truth Euler
      Angles', 'Interpreter', 'latex', 'FontSize', 18)

subplot(312)
plot(time_stamps_store(1:m1), xhat_store(2, 1:m1)*180/pi, 'LineWidth',
     2);
ylabel('$\theta$ (deg)', 'Interpreter', 'latex', 'FontSize', 14)
xlabel('$t$ (s)', 'Interpreter', 'latex', 'FontSize', 14)

subplot(313)
plot(time_stamps_store(1:m1), xhat_store(3, 1:m1)*180/pi, 'LineWidth',
     2);
ylabel('$\phi$ (deg)', 'Interpreter', 'latex', 'FontSize', 14)
xlabel('$t$ (s)', 'Interpreter', 'latex', 'FontSize', 14)

figure;
plot(time_stamps_store(1:m1), P_trace_store(1:m1), 'LineWidth', 2);
title('Problem 6 $\mathrm{tr}$
      (P)$', 'Interpreter', 'latex', 'FontSize', 18)

disp('The resultant angles correctly describe the devices movement and
      match ')
disp('those found in step 3.')

```

Function definitions

```
function x_dot = attitude_kinematics_asg3(x_, u_)
```

```

theta_ = x_(2);
phi_ = x_(3);

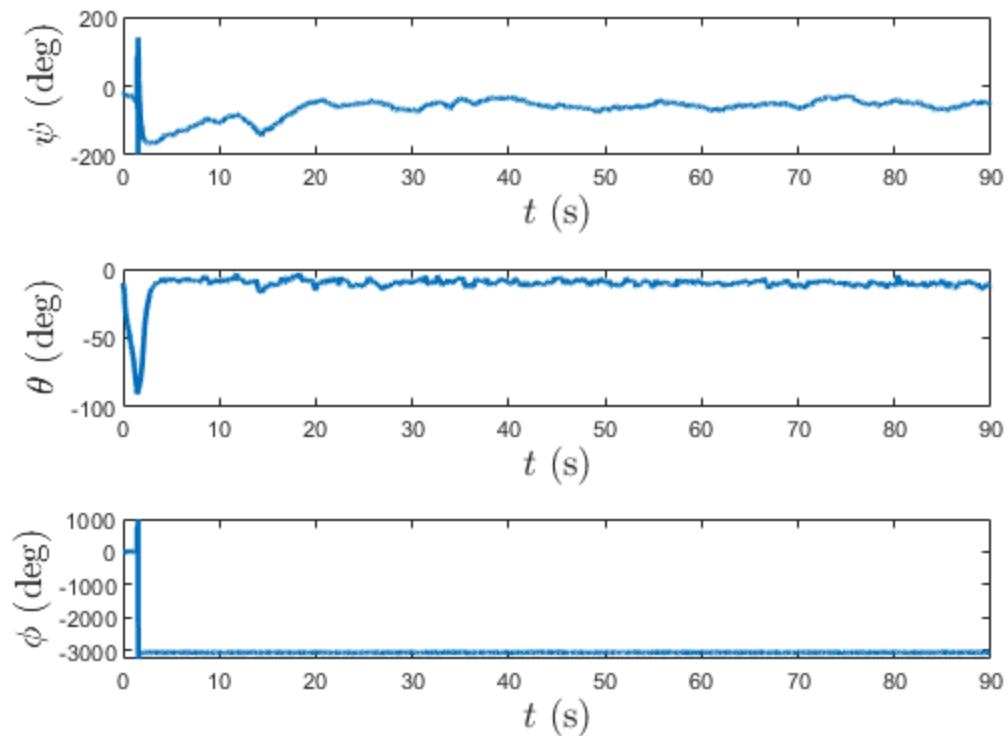
x_dot = [-sin(theta_) 0 1; ...
         sin(phi_)*cos(theta_) cos(phi_) 0; ...
         cos(phi_)*cos(theta_) -sin(phi_) 0] \ u_;
end

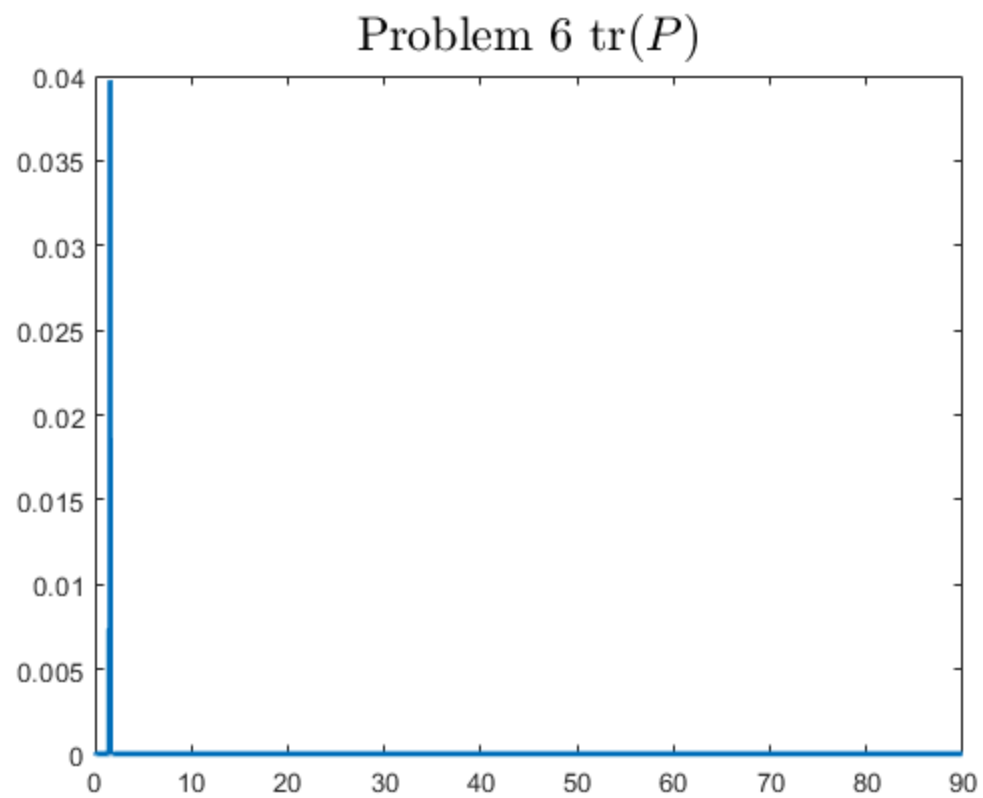
function z_ = attitude_measurement_asg3(x_, u_, V)
psi_ = x_(1);
theta_ = x_(2);
phi_ = x_(3);
z_ = [ V*[...
       0 sin(theta_) 0; -sin(theta_) 0 cos(theta_); 0 -cos(theta_) 0]*u_
      + ...
      9.81*[sin(theta_); -cos(theta_)*sin(phi_); -cos(theta_)*cos(phi_)];
psi_];
end

```

The resultant angles correctly describe the devices movement and match those found in step 3.

Problem 6 Ground Truth Euler Angles





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