# ESE 650, Spring 2019 Assignment 2

Due on Friday February 21st, 2020, 11:59PM

This assignment is split into two parts. The first part is worth 25 points and the second points is worth 75 points.

### 0.1 Errata

1. Feb 11: Increased value of IMU project to 84 pts, clarified use of scipy.

## 1 EKF (25 Points)

Problem 1 Extended Kalman Filter Problem

Consider a dynamical system defined by the following functions, g, and h corresponding to state update and measurement.

$$g\left(\begin{pmatrix} x_1 \\ x_2 \end{pmatrix}, \begin{pmatrix} u_1 \\ u_2 \end{pmatrix}\right) = \begin{pmatrix} x_1 + u_2 x_2 + u_1 x_1^2 \\ u_1 x_2 + u_2 \log(x_1) \end{pmatrix}$$
$$h = (x_1/x_2)$$

- Compute expressions for the relevant Jacobian matrices,  $G_t$  and  $H_t$ , used in the Extended Kalman filter.
- Compute the Kalman gain matrix  $K_t$  using the following parameter values.

$$\hat{\mathbf{x}}_{t-1} = \begin{pmatrix} 3 \\ 4 \end{pmatrix}, \ \mathbf{u}_t = \begin{pmatrix} 1 \\ 2 \end{pmatrix},$$

$$\Sigma_{t-1} = \begin{pmatrix} 8 & 3 \\ 3 & 4 \end{pmatrix}, \ R_t = \begin{pmatrix} 5 & 1 \\ 1 & 3 \end{pmatrix}, \ Q_t = 10$$

Note that you should compute  $\Sigma_t$  before computing  $K_t$ 

# 2 Estimate Orientations (84 Points)



In this project, you will implement a Kalman filter to track three dimensional orientation. Given IMU sensor readings from gyroscopes and accelerometers, you will estimate the underlying 3D orientation by determining the appropriate model parameters from ground truth data given by a Vicon motion capture system.

This project mainly revolves around implementing the algorithm described in this paper: A Quaternion-base Unscented Kalman Filter for Orientation Tracking.

Data is available here https://upenn.box.com/s/0sco8ey93itpdjdssrba2du50lita376

### Instructions and Tips

1. You will find a set of IMU data and another set of data that gives the corresponding tracking information from the Vicon motion capture system. Download these files and be sure you can load and interpret the file formats.\* The files are given as '.mat' files. Make sure you can load these into python first. (Hint scipy.io.loadmat - but note that this is the only purpose you may use scipy for.)

- 2. This will return a dictionary form. Please disregard the following keys and corresponding values: 'version', 'header', 'global'. The keys, 'cams', 'vals', 'rots', and 'ts' are the main data you need to use.
- 3. Note that the biases and scale factors of the IMU sensors are unknown, as well as the registration between the IMU coordinate system and the Vicon global coordinate system. You will have to figure them out.
- 4. You will write a function that computes orientation only based on gyro data, and another function that computes orientation only based on accelerometer data. You should check that each function works well before you try to integrate them into a single filter. This is important!
- 5. You will write a filter to process this data and track the orientation of the platform. You can try to use a Kalman filter, EKF or UKF to accomplish this. The paper linked above utilizes a UKF. You will have to optimize over model parameters. You can compare your resulting orientation estimate with the "ground truth" estimate from the Vicon.

We will use gradescope to submit assignments. Submit to Homework Project 2 - Code. The autograder will test performance on the datasets provided to you, as well as additional held-out datasets. Make sure you submit estimate\_rot.py as well as all its dependencies.

Submit a pdf with your answers to Problem 1 on gradescope under Homework Project 2 - PDF.