

# **EECE 212 Final Project Report**

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## **I. Dynamic systems with disturbances**

**gen\_state.m** takes inputs:

- **t**: which is the time spacing vector from 0 to 60 seconds.
- **pv0**: a column vector containing the initial x and y positions and velocities.
- **sigma\_x**: x multiplier for standard deviation.
- **sigma\_y**: y multiplier for standard deviation

**gen\_state** outputs:

- **x**: which is a time-varying state vector.

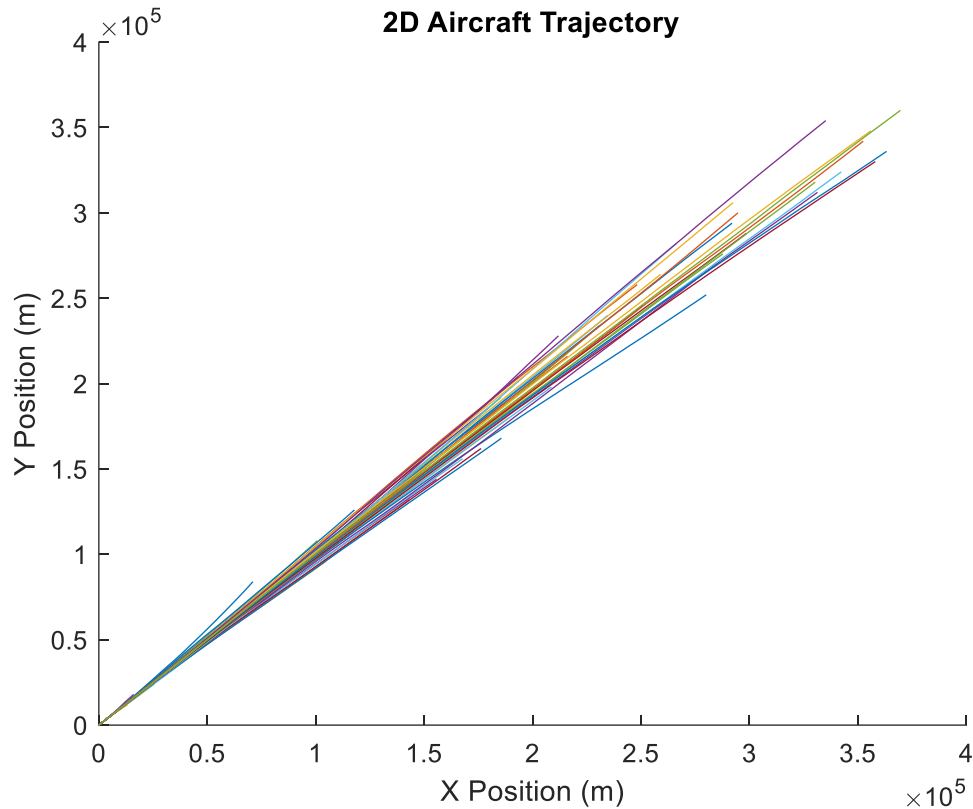
Within **gen\_state**, we defined:

- The state transition matrix **A** represents a 2D constant-velocity model.
- The input matrix **B** applies **sigma\_x** and **sigma\_y** multipliers to the x and y velocity states, respectively.
- **time\_span** and **time\_len** are defined to generate a row vector from 0 to 60 and give its length.
- **randInp** generates two random input row vectors with length **time\_len** = 61.
- **x** is initialized as the 4 by 61 time varying state vector depending on **time\_len**.
- The first column of **x** is then filled with the values of **pv0** and the rest of the columns are filled by iterating through  $A*x(:,i-1) + B*randInp(:,i)$  from 2 to **time\_len** = 61

**project\_1.m** is the plot script for **gen\_state**:

- **pv0** is defined as a column vector [0; 100; 0; 100] in the order of [x position, x velocity, y position, y velocity].
- Within **project\_1**, **sigma\_x** and **sigma\_y** are defined as 1 to give variation from a true constant-velocity path.
  - As sigma values are increased, there is more deviance from true constant-velocity path.
- The 2D trajectory is then plotted over  $t = 0$  to 60 by iterating through the function **gen\_state** over those **t** values.
- Labels and a legend were then added to the plot of the 2D trajectory.

**project\_1** outputs the figure:



with  $\sigma_x$  and  $\sigma_y$  values set equal to 1, initial positions set to zero, and initial velocities set to 100.

## II. Using Sensors to Measure States

**measure\_state.m** takes inputs:

- **C**: which is the general sensor matrix defined in the plot script **project\_2.m**
- **noise\_lvls**: which is a vector containing the noise levels that are to be used as the diagonals of output matrix **D**.
- **state\_vectors**: holds the sequence of state vectors that are to be measured

**measure\_state** outputs:

- **D**: which is the time-varying measurement vector

Within **measure\_state**, we defined:

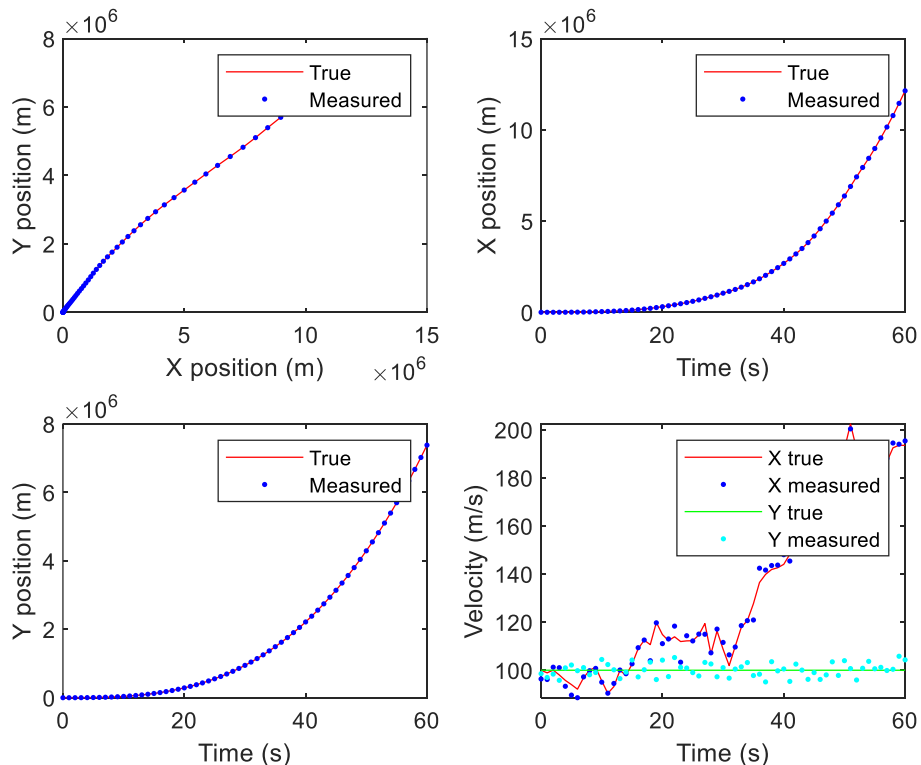
- **D** was initialized as a matrix with the values of **noise\_lvls** on the diagonals
- The matrix **D** was then filled with the calculated measured state vectors using the formula  $Cq[n] + Dw[n]$  according to the project instructions.
  - Within **measure\_state**, the MATLAB function **mvnrnd** was used to return the measured state vectors with inputs:

- Mean vector  $\mu$ : a zero vector of size length of C by 1
- Sigma: matrix D taken as input
- n: size of state\_vectors input by 2 number of random vectors
- If noise levels are 0 or less, measure\_state returns an error.

**project\_2.m** is the plot script for measure\_state:

- The parameters for gen\_state and measure\_state were defined with:
  - $\sigma_x = 1$ ,  $\sigma_y = 1$ ,  $pv0 = [0; 100; 0; 100]$ ,  $t = 0$  to 60
- noise\_lvls was defined as [25; 10; 25; 10] with order [x position, x velocity, y position, y velocity].
- C was defined as the system matrix for measure\_state, which is an identity matrix of size 4 by 4.
- The output for gen\_state is calculated similar to project\_1.
- The measured states with noise are calculated by iterating through measure\_state with inputs C, noise\_lvls, and the output of gen\_state for  $t = 0$  to 60.
- Four graphs were then generated, showing:
  - Y-position vs X-position
  - X-position vs time
  - Y-position vs time
  - Velocity v time

project\_2 outputs the figure:



With the initial positions set to zero, initial velocities set to 100,  $\sigma_x$  and  $\sigma_y$  set to 1, and  $\text{noise\_lvls}$  set to 25 for positions and 10 for velocities.

### III. Exploiting the Dynamic Model to Improve Sensor Measurements

**RLS\_estimation.m** takes inputs:

- A: which is the state model matrix.
- R: which is the forgetting factor matrix.
- y: which is the matrix of output vectors with each column being a measurement vector.

RLS\_estimation outputs:

- $\hat{Q}$ : is the matrix of estimated state vectors using RLS. Each column is an estimated measurement vector.

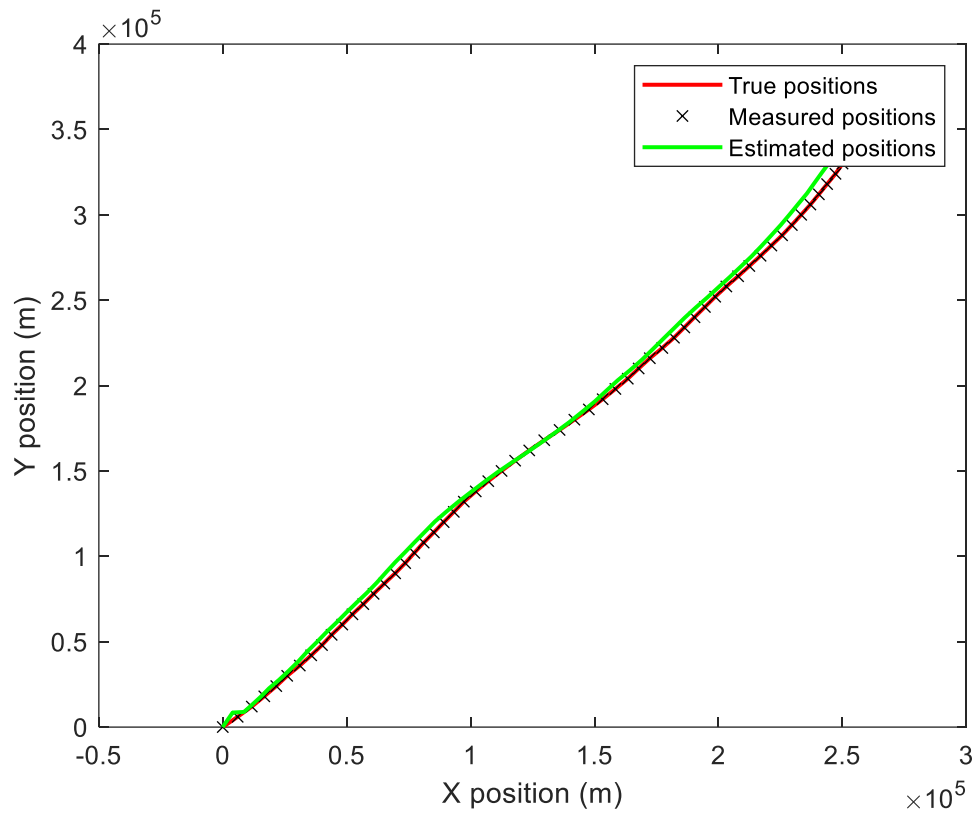
Within RLS\_estimation, we defined:

- k as the number of measurements taken from the size of matrix y with dimension two.
- n as the number of states taken from the size of the state model matrix A with dimension one.
- P is defined as the first covariance matrix with identity matrix of size n.
- The initial estimate of  $\hat{Q}$  is initialized as a zero matrix of size n by 1.
- The rest of the function calculates the Kalman gain, covariance matrix, and estimated state vector as according to project instructions over the interval of 1 to k.
- After calculating the above from 1 to k, the initial estimate is removed from the output as it is no longer necessary to compute RLS estimation.

**project\_3.m** is the plot script for RLS\_estimation:

- The parameters for **gen\_state**, **measure\_state**, and **RLS\_estimation** are defined as:
  - $\sigma_x = 5$ ,  $\sigma_y = 5$ ,  $\text{pv0} = [0; 100; 0; 100]$ , and  $\text{noise\_lvls} = [25; 10; 25; 10]$  with order [x position, x velocity, y position, y velocity].
- The true states were generated with **gen\_state** from time 0 to 60.
- The measured states were generated with **measure\_state** with inputs of a identity matrix of size 4 by 4, the  $\text{noise\_lvls}$  column vector, and the values of the true states from **gen\_state**.
- The RLS filter estimated states were calculated by defining matrix A as an identity matrix of size 4 by 4 and a forgetting factor R of 0.999. These were inputs to **RLS\_estimation** along with the measured states to give the estimated states.
- The true states, measured states, and estimated states were plotted as the true, measured, and estimated positions of 2D trajectory.

**project\_3** outputs the figure:



With the initial positions set to zero, initial velocities set to 100, sigma\_x and sigma\_y set to 5, noise\_lvls set to 25 for positions and 10 for velocities, and the forgetting factor R set to 0.999.