

**Problem 1**

Consider the scalar system

$$\dot{x} = -x + u + w$$

$w$  is zero-mean process noise with a variance of  $Q$ . The control has a mean value of  $u_0$ , an uncertainty of 2 (one standard deviation), and is uncorrelated with  $w$ . Rewrite the system equations to obtain an equivalent system with a normalized control that is perfectly known. What is the variance of the new process noise term in the transformed system equation?

*Solution:* The variance of the new process noise,  $w_u$  is  $\Sigma_{w_u} = Q + \sigma_u^2 = Q + 4$ .

$$\dot{x} = -x + u_0 + \underbrace{w + \Delta u}_{w_u}, \quad w_u \sim (0, Q + \sigma_u^2).$$

**Problem 2**

Consider the system

$$x_{k+1} = \phi x_k + w_k,$$

$$y_k = x_k,$$

where  $w_k \sim (0, 1)$ , and  $\phi = 0.9$  is an unknown constant. Design an extended Kalman filter to estimate  $\phi$ . Simulate the filter for 100 time steps with  $x_0 = 1, P_0 = I, \hat{x}_0 = 0$ , and  $\hat{\phi}_0 = 0$ . Hand in your source code and a plot showing  $\hat{\phi}$  as a function of time.

*Solution:* Perform the measurement update of the state estimate and estimation error covariance as follows

$$K_k = P_k^- H_k^\top (H_k P_k^- H_k^\top + R_k)^{-1} = P_k^- H_k^\top (H_k P_k^- H_k^\top)^{-1}, \quad \text{Since } R_k = 0,$$

$$\hat{x}_k^+ = \hat{x}_k^- + K_k (y_k - h_k(\hat{x}_k^-, 0))$$

$$= \hat{x}_k^- + K_k (y_k - \hat{x}_k^-), \quad \text{Since } \hat{\phi}_k^- = 0,$$

$$P_k^+ = (I - K_k H_k) P_k^-$$

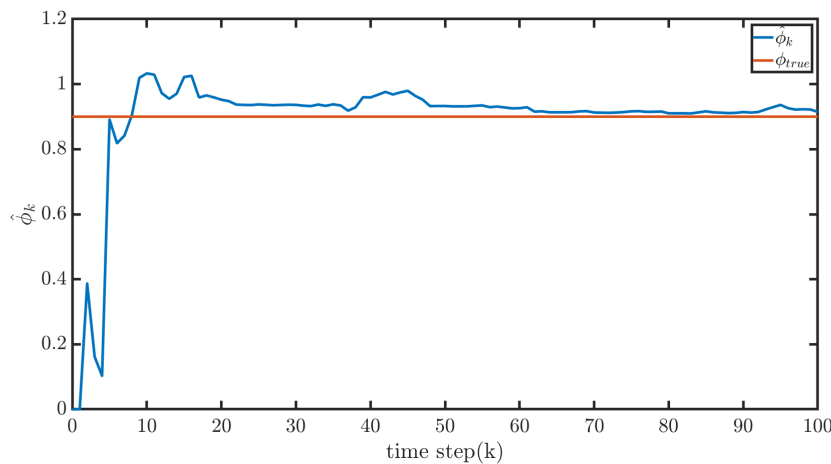


Figure 1: Plot showing  $\hat{\phi}$  as a function of time.

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1 %
2 % Venkatraman Renganathan
3 % MECH 6325 – Optimal Estimation & Kalman Filtering, Term: Fall 2019
4 % MATLAB Code for HW6Q2
5 %
6 clear; clc; close all;
7
8 %% Problem Data
9 H = [1 0]; % Output Matrix
10 Qw = 1; % Process Noise Covariance
11 Q = [Qw 0; % Augmented Process Noise Covariance diag(Qw,Q-phi),Q-phi = 0
12 0 0];
13 N = 100; % Simulation Time Steps
14
15 % Initial values
16 x = 1;
17 Pplus = eye(2);
18 phiTrue = 0.9;
19 xHat = 0;
20 phiHat = 0;
21 varPhi = [phiHat];
22 % Simulate the Discrete-Time EKF
23 for i = 1:N
24     x = phiTrue*x + sqrt(Qw).*randn; % x = phi*x + w, w~(0,1)
25     y = x;
26     F = [phiHat xHat;
27 0 1];
28     Pminus = F*Pplus*F' + Q;
29     xHat = phiHat*xHat;
30     K = Pminus*H'*inv(H*Pminus*H');
31     z = [xHat; phiHat];
32     z = z + K*(y - xHat);
33     xHat = z(1);
34     phiHat = z(2);
35     Pplus = (eye(2) - K*H)*Pminus;
36     % Store Value of phiHat
37     varPhi = [varPhi phiHat];
38 end
39 % Plot the results
40 figure;
41 timeVec = 0:N;
42 plot(timeVec, varPhi);
43 hold on;
44 plot(timeVec, phiTrue*ones(N+1,1));
45 set(gca, 'FontSize', 12); set(gcf, 'Color', 'White'); set(gca, 'Box', 'on');
46 xlabel('time step(k)', 'interpreter', 'latex');
47 ylabel('$\hat{\phi}_{k}$', 'interpreter', 'latex');
48 legend('$\hat{\phi}_{k}$', '$\phi_{true}$', 'interpreter', 'latex');
49 a = findobj(gcf, 'type', 'axes');
50 h = findobj(gcf, 'type', 'line');
51 set(h, 'linewidth', 4);
52 set(a, 'linewidth', 4);
53 set(a, 'FontSize', 30);
54 set(gca, 'TickLabelInterpreter', 'latex');

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