

# DYNAMIC STOCHASTIC FILTERING, PREDICTION AND SMOOTHING

## Instituto Superior Técnico

PhD Program in Electrical Engineering and Computers

Area of Systems, Decision, and Control

Spring Semester 2009/2010

### 2<sup>nd</sup> Problem Set

This is the second problem set, of a series of five, in the Dynamic Stochastic Filtering, Prediction, and Smoothing Course. This problem set consists on the detailed synthesis and analysis of a optimal estimation problem. Physical insight for the solutions obtained is important.

#### Problem

Consider the problem of estimating the state variables of a Direct-Current (DC) motor described by the transfer function

$$\mathbf{G}(s) = \frac{\omega(s) \theta(s)}{u(s) \varpi(s)} = \frac{a}{s(s+b)},$$

where  $\theta(t)$  is the motor rotor angle,  $\omega(t)$  is the angular velocity, and  $u(t)$  is the command voltage at the motor input. For numerical computations consider  $a=100\text{rad s}^{-1} \text{V}^{-1}$  and  $b=30 \text{s}^{-1}$ .

#### Part 1

- 1) Write a state model for the motor described by the transfer function  $\mathbf{G}(s)$ .
- 2) Resorting to the step-invariant discretization method obtain a discrete time equivalent model, given the sampling period  $h=0.01\text{s}$ .
- 3) Characterize the resulting model in terms of stability and invariance. How are these properties for the continuous and discrete time versions related? And in the general case of non-linear systems?
- 4) Simulate the discrete time systems for an interval of 10 seconds, considering that the input is given by  $u(k)=\sin(2 \pi k h) \text{V}$ ,  $k=1\dots 1000$ . The motor starts the experiment at rest with the rotor angle at  $30 \pi /180 \text{ rad}$ . This test, given the absence of stochastic phenomena is usually denominated as “sanity check”.

#### Parte 2

After extensive laboratory tests it was found that the angular position is corrupted by zero mean white Gaussian noise with variance  $(0.1 \pi /180)^2 \text{ rad}^2$ . The velocity is corrupted by zero mean white Gaussian noise with variance  $(0.05 \pi /180)^2 (\text{rad s}^{-1})^2$ .

- a) Compute how this stochastic process evolves, given that the motor starts at rest with the initial angular position described as a random Gaussian variable with expected value  $30 \pi / 180$  rad and variance  $(0.5 \pi / 180)^2$  rad<sup>2</sup>.
- b) Show the evolution of the state variables resorting to 10 MATLAB simulations. Comment on the results obtained.

### Part 3

Given the uncertainties previously described, a stationary Kalman filter should be designed to obtain optimal estimates on the state variables. To achieve that purpose consider that a angular sensor is installed on the motor axis, providing measurements with null mean error and variance

$(5 \pi / 180)^2$  rad<sup>2</sup>.

- a) Design a block diagram, as detailed as possible, to describe the Kalman filter and its connection to the “real” system.
- b) Compute the evolution of the expected values of the state variables considered.
- c) Compute the evolution of the state estimate error covariance, for the state variables considered.
- d) Implement in MATLAB the proposed block diagram and simulate for a reasonable time interval the evolution of the motor and of the estimator. Consider also the original continuous time model of the motor. Comment on the results.
- e) Compute the stationary Kalman filter gains and compare them with the results previously obtained. Discuss the results obtained.

### Parte 4

Assume that a more accurate sensor becomes available, now with a variance  $(0.1 \pi / 180)^2$  rad<sup>2</sup>.

- f) Based on the expressions obtained in c) and e) compute the new values for the estimation error covariance and the Kalman filter gains. Discuss the results.
- g) Obtain the transfer functions from the angular measurement inputs to the angular position estimates. Discuss the stability and bandwidth of the systems obtained, resorting to a Bode diagram, for the two cases studied previously.

Solutions due in April 28<sup>th</sup> 2010

Please return your personnel solutions in the class, in my office (room 8.10, North Tower), in the DSOR secretariat or by e-mail. A penalty of 2% per day will be used for late problem set solutions.

Bom trabalho ;)

Paulo Oliveira

IST, April 14<sup>th</sup> 2010