

Diagnosis, Fault-tolerant and Robust Control for  
a Torsional Control System

Mandatory assignment in DTU course 31320

Part A and B

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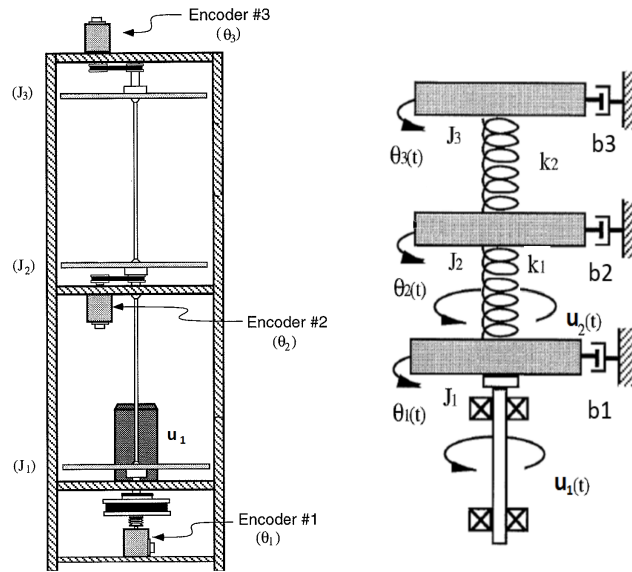
Table 1: Revision history			
version	date	description	changes
1.a	10.02.2022	new	all pages new
2.a	19.04.2022	new part B	Q9 - Q12
2.b	22.04.2022	new part B	Q13 - Q16

# Assignment part A - 2022

## Introduction

This exercise presents a model of the ECP M205a system. It is a three-mass system that comprises three identical disks, connected in parallel via a flexible low-damped shaft. The system is equipped with three incremental position encoders (one for each disk) and two actuators, i.e. a motor applying torques to the bottom disk and one more for the middle disk.

The control goal is to ensure that either of the disks tracks a specified motion profile. The system considered is sketched in Figure 1. The variables are explained in Table 2.



The normal behaviours of the systems are described by the following con-

Table 2: **List of variables**

variable	unit	description
$\theta_1$	rad	angular position of bottom disk
$\omega_1$	$\text{rads}^{-1}$	angular velocity of bottom disk
$\theta_2$	rad	angular position of middle disk
$\omega_2$	$\text{rads}^{-1}$	angular velocity of middle disk
$\theta_3$	rad	angular position of top disk
$\omega_3$	$\text{rads}^{-1}$	angular velocity of top disk
$u_1$	Nm	torque command for the bottom disk
$u_2$	Nm	torque command for the middle disk
$y_1$	rad	measured angular position of bottom disk
$y_2$	rad	measured angular position of middle disk
$y_3$	rad	measured angular position of top disk

straints:

$$\begin{aligned}
c_1 : 0 &= \dot{\theta}_1 - \omega_1 \\
c_2 : 0 &= J_1 \dot{\omega}_1 - u_1 + b_1 \omega_1 + k_1 (\theta_1 - \theta_2) + d \\
c_3 : 0 &= \dot{\theta}_2 - \omega_2 \\
c_4 : 0 &= J_2 \dot{\omega}_2 - u_2 + b_2 \omega_2 + k_1 (\theta_2 - \theta_1) + k_2 (\theta_2 - \theta_3) \\
c_5 : 0 &= \dot{\theta}_3 - \omega_3 \\
c_6 : 0 &= J_3 \dot{\omega}_3 + b_3 \omega_3 + k_2 (\theta_3 - \theta_2) \\
d_7 : 0 &= \dot{\theta}_1 - \frac{d\theta_1}{dt} \\
d_8 : 0 &= \dot{\omega}_1 - \frac{d\omega_1}{dt} \\
d_9 : 0 &= \dot{\theta}_2 - \frac{d\theta_2}{dt} \\
d_{10} : 0 &= \dot{\omega}_2 - \frac{d\omega_2}{dt} \\
d_{11} : 0 &= \dot{\theta}_3 - \frac{d\theta_3}{dt} \\
d_{12} : 0 &= \dot{\omega}_3 - \frac{d\omega_3}{dt} \\
m_{13} : 0 &= y_1 - \theta_1 \\
m_{14} : 0 &= y_2 - \theta_2 \\
m_{15} : 0 &= y_3 - \theta_3
\end{aligned}$$

where  $d \triangleq T_C(\omega_1)$  is a function of the bottom disk angular velocity and represents the *unknown* Coulomb friction torque on that disk. The control input saturates at 2 Nm, i.e.  $u_1 \in [-2, 2]$  Nm. The parameters in the forgoing con-

straints are listed in Table 3.

Table 3: List of parameters			
symbol	value	unit	description
$J_1$	0.0025	$\text{kgm}^2$	Bottom disk moment of inertia
$J_2$	0.0018	$\text{kgm}^2$	Middle disk moment of inertia
$J_3$	0.0018	$\text{kgm}^2$	Top disk moment of inertia
$k_1$	2.7	$\text{Nmrad}^{-1}$	Stiffness of the bottom shaft
$k_2$	2.6	$\text{Nmrad}^{-1}$	Stiffness of the middle shaft
$b_1$	0.0029	$\text{Nmsrad}^{-1}$	Damping/friction on the bottom disk
$b_2$	0.0002	$\text{Nmsrad}^{-1}$	Damping/friction on the middle disk
$b_3$	0.00015	$\text{Nmsrad}^{-1}$	Damping/friction on the top disk

A Simulink model and a parameter initialisation file have been uploaded to DTU Learn in the *File share/Matlab and Simulink files/Mandatory Assignment Part A* folder for your convenience.

## Question 1

Make a structural analysis:

1. Determine a complete matching on the unknown variables.
2. Find the parity relations in symbolic form.
3. Investigate other properties you find relevant from a structural analysis.
4. Reformulate the parity relations to an analytic form, as functions only of known variables and the system parameters.

## Question 2

1. Design a set of proper residual generators, i.e. residual generators that are stable and are causal.
2. Discretise your residuals with sampling period  $T_s = 4$  ms.
3. Implement your residual generators using a Simulink model of the system and demonstrate by simulation (in open loop) that your residuals are insensitive to changes of control inputs.

## Question 3 (Experimental work)

A single sensor additive fault afflicted the measurements.

1. Test the implemented residual generators on the ECP M502a torsional system. Demonstrate their fault-detection properties.
2. Which of the three sensors is afflicted by the fault? Justify your answer.
3. Are the residuals insensitive to input changes? Comment on the results.

**Hint:** In order to load the recorded inputs and outputs in Simulink, you can set them in a timeseries structure (Matlab command `timeseries()`) and use the “From Workspace” block in Simulink.

## Question 4

Faults are possible on any of the sensors or at the actuator.

1. Model these as additive faults and write the system in the standard form

$$\begin{aligned}\dot{\mathbf{x}} &= \mathbf{A}\mathbf{x} + \mathbf{B}\mathbf{u} + \mathbf{E}_x\mathbf{d} + \mathbf{F}_x\mathbf{f} \\ \mathbf{y} &= \mathbf{C}\mathbf{x} + \mathbf{D}\mathbf{u} + \mathbf{E}_y\mathbf{d} + \mathbf{F}_y\mathbf{f}\end{aligned}$$

where the matrices need be determined and the vector  $\mathbf{f}$  contains all actuator and sensor faults.

2. Determine the transfer function  $H_{rf}(s)$  from faults to residuals in your LTI design.
3. Investigate strong and weak detectability of the faults.
4. What would change in terms of fault detectability if the Coulomb friction function  $T_C(\omega_1)$  were known?

**Hints:** For this task it is useful to find a basis for the left nullspace by using the Matlab symbolic toolbox in defining the various transfer functions (e.g. `syms s; G = 1/(s + 1)`). You may find the following functions useful:

- `simplify` - simplifies symbolic expression,
- `expand` - expands symbolic expression,
- `numden` - extracts numerator and denominator of symbolic fraction,
- `sym2poly` - converts symbolic polynomial to numeric,
- `minreal` - gives a minimal realization of a transfer function,
- `zpk` - expresses a transfer function as a zero-pole-gain product.

## Question 5

The sensors have measurement noise. The noise of individual sensors is uncorrelated, i.e.

$$\begin{bmatrix} y_1 \\ y_2 \\ y_3 \end{bmatrix} \sim \mathcal{N} \left( \begin{bmatrix} 0 \\ 0 \\ 0 \end{bmatrix}, \begin{bmatrix} \sigma_1^2 & 0 & 0 \\ 0 & \sigma_2^2 & 0 \\ 0 & 0 & \sigma_3^2 \end{bmatrix} \right) \quad (1)$$

with  $\sigma_1 = \sigma_2 = \sigma_3 = 0.0093$  rad.

Choose a residual generator that is sensitive to faults on  $y_2$ .

1. Calculate the variance at the output of the residual.
2. Design a GLR detector that can detect a sudden offset fault of unknown magnitude in sensor  $y_2$ . Tune the GLR by determining the threshold  $h$  and the window size  $M$ , such that if the fault on  $y_2$  has magnitude  $f_2 = -0.025$  rad, then the false alarm probability will be  $P_F = 0.0001$  or lower and the probability of missed detection  $P_M = 0.01$  or lower.
3. Implement the designed GLR in Simulink and validate the design in simulation.

## Question 6 (Experimental work)

Test your GLR detector on the ECP M502a torsional system. Connect the GLR block to the residual generator from Question 5 and demonstrate its robustness properties with respect to false alarms. Comment on the results.

**Hint:** You can use the "Matlab function" block in Simulink from the "user-defined functions" library.

## Question 7

A discrete linear quadratic regulator (DLQR) is to be designed to ensure that the top disk tracks a given step change  $\theta_{ref}$  in its position. The resulting closed loop system should have the following form

$$\mathbf{x}(k+1) = (\mathbf{F} - \mathbf{G}\mathbf{K}_c) \mathbf{x}(k) + \mathbf{G}\mathbf{K}_c \mathbf{C}_{ref} \theta_{ref}(k) + \mathbf{E}_x d(k) \quad (2)$$

$$\mathbf{y}(k) = \mathbf{C} \mathbf{x}(k) + \mathbf{E}_y d(k) \quad (3)$$

with  $\mathbf{F} \in \mathbb{R}^{6 \times 6}$ ,  $\mathbf{G} \in \mathbb{R}^{6 \times 2}$  being the discretised system matrices and  $\mathbf{C}_{ref}$  is a scaling matrix for the scalar reference signal.

1. Discretise the system with sampling period  $T_s = 4$  ms.

2. Show that the reference scaling matrix  $\mathbf{C}_{ref}$  is given by

$$\mathbf{C}_{ref} = (\mathbf{C}_3(\mathbf{I} - \mathbf{F} + \mathbf{G}\mathbf{K}_c)^{-1}\mathbf{G}\mathbf{K}_c)^+ \\ \mathbf{C}_3 = \begin{bmatrix} 0 & 0 & 0 & 0 & 1 & 0 \end{bmatrix},$$

where  $\mathbf{X}^+$  denotes the pseudoinverse of a matrix  $\mathbf{X}$ .

3. Design a full state-feedback DLQR and choose the weighting matrices as following:

$$\mathbf{Q}_c = \begin{bmatrix} 2 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 2 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 2.5 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0.0024 \end{bmatrix}, \mathbf{R}_c = \begin{bmatrix} 10 & 0 \\ 0 & 10 \end{bmatrix}.$$

4. Implement the controller in Simulink and simulate the closed-loop system for a square wave reference of amplitude  $|\theta_{ref}(k)| = \frac{\pi}{2}$  rad (from 0 to  $\frac{\pi}{2}$ ), period 10 s and width 5 s.

**Assumption:** A Kalman filter with friction estimation is provided to you such that all the states are considered available for feedback.

## Question 8

An additive fault  $f_u$  suddenly corrupts the second actuator at  $t = 25$  s, such that it can no longer be used (the second column of  $\mathbf{B}$  includes only zeros). Assuming that the fault is detected after 3.75 s,

1. Can there be perfect static reconfiguration? Justify your answer.
2. Simulate the effect of the fault and design a virtual actuator in discrete time to recover from it.
3. Implement the virtual actuator and add it to the existing Simulink file that is provided to you. Simulate the closed-loop system for the same reference and comment on the tracking performance and the outputs of the residuals.

## Bonus experimental work (optional extra points)

Design an integral virtual sensor to recover from the additive sensor fault of Question 5. Assume that once the fault is detected, the sensor is discarded ( $C$  loses a row). Implement the virtual sensor in Simulink and test it on the ECP M502a torsional system. Use the decision function from the GLR to enable the virtual sensor whenever a fault in  $y_2$  is detected. Comment on the quality of the reconstructed measurements in the presence of a fault on  $y_2$ .



## Practical notes

- The deadline for the report is **Wednesday March 16, 2022, at 23:55 hours.**
- Please note that max. 20 pages are allowed for part A, excluding front matter. Any pages in excess of 20 (excluding front matter) will be discarded.
- Layout must be reasonable: A4 paper, 20mm margins and font size 11pt.
- The report need be delivered in electronic form, as a .pdf file, via the DTU Learn assignment system. Only pdf files are accepted.
- Group-work is encouraged (max 2 persons in one group).
- Please do **write your name(s) and student number(s) at the front page and as running heading on each page of your report.** In addition, do not forget page numbers.

# Assignment part B - 2022

## Introduction

The Assignment part B deals with robust control for the torsion control system used in part A. The questions in this part is divided into two groups. The first group of questions is related to design and analysis of controllers for the nominal system where performance of the closed-loop system is the main goal. In the last group of questions, the robustness with respect to model variations is included in the design, so it is possible to investigate the trade-off between robust stability and performance.

The same system description and parameters used in part A is used in this part.

## Question 9

Design of an  $H_\infty$  controller for the nominal system based on the following:

- Use a mixed sensitivity setup.
- Use only the measurement for the top disk - i.e. consider the system as a SISO system.
- Use only weights on the sensitivity function and the controller sensitivity function.
- Design a controller that include integration (almost).
- Design with a reasonable bandwidth, not too high. It can be mentioned that it is possible to get a bandwidth around  $40rad/sec$  using the mixed sensitivity setup, but design for a lower bandwidth.
- Take care of the limitation in the control input. The controller should be able to handle a unit step at the reference input without going into limitation.

It can be recommended that the applied weight functions is scaled such that the obtained  $\gamma$  is 1. Further, it is important that the controller does not have too high gains.

A description of the selection of the weight functions need to be given. Further, show the real obtained closed-loop system (and this is not just to give the state space matrices for it).

## Question 10

Analysis of the closed-loop system and the feedback controller.

- Calculate the poles and zeros of the controller and compared it with the poles and zeros for the system and the applied weight functions.
- Analyze the system in the frequency domain and show the necessary Bode-plots.
- Verify that the design satisfies the design conditions.

## Question 11

Validation of the controller design is done by simulation.

- Validate the closed-loop system including the  $H_\infty$  controller by simulation. The simulation is done by the Simulink model (at DTU Learn from part A) where the reference input is given. The Coulomb friction on disk 1 need to be removed.
- Use the simulation to verify that the design conditions are met.
- Discuss also how well the controller will be able to handle the system including a Coulomb friction on disk 1.

## Question 12

Robustness analysis.

Assume that the system is described by a nominal model together with a multiplicative model uncertainty at the output. The uncertainty is unknown.

- Apply the controller from question 9. Calculate the maximal multiplicative uncertainty at the output that can be handled and still guarantee robust stability.
- Calculate the maximal multiplicative uncertainty at the output that can be handled and still guarantee robust performance. The weight function for the performance in question 9 need to be used.
- Discuss the result.

## Question 13

Model of uncertainties in the system.

The inertia of the bottom disk is now changes. The inertia  $J_1$  is changes from  $J_1 = 0.0025 \text{ kgm}^2$  to

$$J_{1,new} = 0.0325 \text{ kgm}^2$$

Assume that system described by an uncertain model given by:

$$G = (1 + W_I \Delta) G_0, \quad |\Delta| \leq 1, \quad \forall \omega$$

where  $G_0$  is the nominal system with  $J_1$ .  $W_I$  is the weight function for the uncertainty  $\Delta$ .

- Calculate an lower bound for  $W_I$  for the system when the inertia of the bottom disk is changed to  $J_{1,new}$ .
- Compare the results with the bounds calculates in question 12. Discuss the result.

## Question 14

Design of an  $H_\infty$  controller for the uncertain system. First, a weight function for the uncertain need to be found. Based on the calculation of an lower bound for the uncertainties in question 13, show that a low order weight function given by:

$$W_I = \frac{0.833s}{s + 0.089} \quad (4)$$

gives a good approximation for the uncertainties up to around  $20 - 25 \text{ rad/sec}$ .

The  $H_\infty$  design is based on the following:

- Use a mixed sensitivity setup.
- Use only the measurement for the top disk - i.e. consider the system as a SISO system.
- Use weights on the sensitivity function, the controller sensitivity function and the complementary sensitivity function. The weight function for the complementary sensitivity function is given by (4).
- Design a controller that include integration (almost).
- The bandwidth should be around  $10 \text{ rad/sec}$  (might be a lower).
- Take care of the limitation in the control input. The controller should be able to handle a unit step at the reference input without going into limitation.

In this design, the weight functions for the sensitivity function and the control sensitivity function needs be scaled such that the obtained  $\gamma$  is 1 or below. Further, it is important that the controller does not have too high gains.

A description of the selection of the weight functions need to be given. The result of the design must be shown.

*Hint:* Start with the same weight function for the sensitivity function and the control sensitivity function from question 9. For reducing the bandwidth, the weight function for the control sensitivity function need to be a high pass filter with a pol not too fast.

## Question 15

Validation of the controller design is done by simulation. The simulation is done by the Simulink model (at DTU Learn from part A) where the reference input is given.

Compared the results with the results for the nominal system in Question 11.

## Question 16

Two questions for discussion - **it is not the intention to design a controller in relation to these two questions.**

- Discuss how the weight functions in the mixed sensitivity setup can be changed so that the resulting controller will be able to handle the system including a Coulomb friction on disk 1.
- Assume now that the measurement is moved from the top disk to the lower disk no. 1. Discuss how this will affect the design of the controller in relation to performance. It is still the position of the top disk that need to be controlled. Discuss also how this change of measurement will change the dynamic in the controller.

## Practical notes

- The deadline for the second report is **Tuesday May 10, 2022, at 23:55 hours.**
- Please note that max. 15 pages are allowed for part B, excluding front matter. Any pages in excess of 15 (excluding front matter) will be discarded.
- Layout must be reasonable: A4 paper, 20mm margins and font size 11pt.
- The report need be delivered in electronic form, as a .pdf file, via the DTU Learn assignment system. Only pdf files are accepted.

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