

# **QUADRUPLE TANK APPARATUS**

## **EEE 588 Design Of Multivariable Control Systems**

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## **Contents**

<b>1</b>	<b>Overview</b>	<b>4</b>
<b>2</b>	<b>Relevant Literature</b>	<b>4</b>
<b>3</b>	<b>Description of MIMO system to be controlled</b>	<b>5</b>
3.1	Introduction . . . . .	5
3.2	Figure of Quadruple Tank Apparatus . . . . .	5
3.3	Relevant Model Information . . . . .	6
3.4	Key Issues in Controlling this system / Fundamental Performance limitations . . .	6
3.5	Reasonable Control System Design Specifications . . . . .	7
<b>4</b>	<b>Non-Linear Model of the System</b>	<b>8</b>
4.1	Variable Definitions and Nominal Values . . . . .	8
4.2	Model Development . . . . .	8
<b>5</b>	<b>Linear Model</b>	<b>12</b>
5.1	Linearizing the Non-Linear Model . . . . .	12
5.2	State space representation of Plant at Minimum Phase . . . . .	13
5.3	State space representation of Plant at Non-Minimum Phase . . . . .	13
<b>6</b>	<b>Analysis of Linear Model: Dynamic Properties</b>	<b>14</b>
6.1	Plant Transfer Function Matrix(TFM) . . . . .	14
6.2	Bode plots . . . . .	14
6.3	Poles . . . . .	18
6.4	Stability . . . . .	18
6.5	Transmission Zeros . . . . .	18
6.6	Zero Directions . . . . .	19
6.7	Pole-Zero plot . . . . .	20
6.8	Singular Plots . . . . .	21
6.9	Dc Gain Matrix . . . . .	24
6.10	Controllability . . . . .	24
6.11	Observability . . . . .	24
<b>7</b>	<b>Control Design</b>	<b>26</b>
7.1	LQR(Linear Quadratic Regulator) Controller . . . . .	26
7.1.1	Minimum Phase Characteristics . . . . .	26
7.1.2	Non-Minimum Phase Characteristics . . . . .	28
7.2	Kalman-Bucy Filter . . . . .	30

7.2.1	Minimum Phase Characteristics . . . . .	30
7.2.2	Non-Minimum Phase Characteristics . . . . .	32
7.3	LQG(Linear Quadratic Gaussian) Controller . . . . .	33
7.3.1	Minimum Phase Characteristics . . . . .	34
7.3.2	Non-Minimum Phase Characteristics . . . . .	36
7.4	H-Infinity Controller . . . . .	38
7.4.1	Minimum Phase Characteristics . . . . .	38
7.4.2	Non-Minimum Phase Characteristics . . . . .	42
7.5	Other Controllers from the Literature . . . . .	46
7.5.1	PI Controller [10][11] . . . . .	46
7.5.2	Loop-Shaping [7] . . . . .	49
<b>8</b>	<b>Hardware Results</b>	<b>50</b>
8.1	Simulation Results . . . . .	50
8.2	Experimental Results . . . . .	52
8.2.1	Tracking . . . . .	53
8.2.2	Disturbance Rejection . . . . .	54
<b>9</b>	<b>Summary and Conclusions</b>	<b>56</b>
<b>10</b>	<b>Cited References</b>	<b>56</b>
<b>11</b>	<b>Relevant Matlab Code</b>	<b>57</b>

## List of figures

1	Quadruple Tank Apparatus . . . . .	5
2	Mass-balance equation for Tank 1 . . . . .	9
3	Mass-balance equation for Tank 2 . . . . .	10
4	Mass-balance equation for Tank 3 . . . . .	10
5	Mass-balance equation for Tank 4 . . . . .	10
6	Bode plot of G(s) min phase (1,1) . . . . .	14
7	Bode plot of G(s) min phase (1,2) . . . . .	15
8	Bode plot of G(s) min phase (2,1) . . . . .	15
9	Bode plot of G(s) min phase (2,2) . . . . .	16
10	Bode plot of G(s) non min phase (1,1) . . . . .	16
11	Bode plot of G(s) non min phase (1,2) . . . . .	17
12	Bode plot of G(s) non min phase (2,1) . . . . .	17
13	Bode plot of G(s) non min phase (2,2) . . . . .	18
14	pole-zero plot minimum phase . . . . .	20
15	pole-zero plot non-minimum phase . . . . .	20
16	Singular Plot of Plant in Minimum Phase . . . . .	21
17	Singular Plot of Plant in Non-Minimum Phase . . . . .	21
18	Singular Plot of Plant with Dynamic Augmentation of Integrator . . . . .	22
19	Principal gains of return ratio using the augmented plant [7] . . . . .	22
20	Singular Plot of Plant with Bilinear Transformation for Min Phase . . . . .	23
21	Singular Plot of Plant with Bilinear Transformation for Non-Minimum Phase . . . . .	23
22	Closed Loop Sensitivity using LQR for Minimum phase . . . . .	26
23	Closed Loop Complementary Sensitivity using LQR for Minimum phase . . . . .	27
24	Step Response of LQR for Minimum Phase . . . . .	27
25	Closed Loop Sensitivity using LQR for Non-Minimum phase . . . . .	28
26	Closed Loop Complementary Sensitivity using LQR for Non-Minimum phase . . . . .	28

27	Step Response of LQR for Non- Minimum Phase . . . . .	29
28	Closed Loop Complementary Sensitivity using LQR with Prefilter for Non-Minimum phase . . . . .	29
29	Closed Loop Sensitivity using Kalman for Minimum phase . . . . .	30
30	Closed Loop Complementary Sensitivity using Kalman for Minimum phase . . . . .	31
31	Kalman Filter Sensitivity and Complementary Sensitivity for Minimum Phase from Reference [7] . . . . .	31
32	Closed Loop Sensitivity using Kalman for Non-Minimum phase . . . . .	32
33	Closed Loop Complementary Sensitivity using Kalman for Non-Minimum phase . . . . .	32
34	Kalman Filter Sensitivity and Complementary Sensitivity for Non-Minimum Phase from Reference [7] . . . . .	33
35	Closed Loop Sensitivity using LQG for Minimum phase . . . . .	34
36	Closed Loop Complementary Sensitivity using LQG for Minimum phase . . . . .	34
37	Sensitivity and Complementary Sensitivity using LQG for Minimum Phase from Reference . . . . .	35
38	Step Response of LQG for Minimum Phase . . . . .	35
39	Closed Loop Sensitivity using LQG for Non-Minimum phase . . . . .	36
40	Closed Loop Complementary Sensitivity using LQG for Non-Minimum phase . . . . .	36
41	Sensitivity and Complementary Sensitivity using LQG for Non-Minimum Phase from Reference . . . . .	37
42	Step Response of LQG for Non- Minimum Phase . . . . .	37
43	Closed Loop Sensitivity using H-Infinity for Minimum phase . . . . .	38
44	Closed Loop Complementary Sensitivity using H-Infinity for Minimum phase . . . . .	38
45	Sensitivity and Complementary Sensitivity using H-Infinity for Minimum Phase from Reference . . . . .	39
46	Step Response of H-Inf for Minimum Phase . . . . .	39
47	K-Sensitivity frequency response using H-Infinity for Minimum Phase . . . . .	40
48	Uncertainty Weighting Function W1 for Minimum phase . . . . .	40
49	Uncertainty Weighting Function W2 for Minimum phase . . . . .	41
50	Uncertainty Weighting Function W3 for Minimum phase . . . . .	41
51	Closed Loop Sensitivity using H-Infinity for Non-Minimum phase . . . . .	42
52	Closed Loop Complementary Sensitivity using H-Infinity for Non-Minimum phase . . . . .	42
53	Sensitivity and Complementary Sensitivity using H-Infinity for Non-Minimum Phase from Reference . . . . .	43
54	Step Response of H-Infinity for Non- Minimum Phase . . . . .	43
55	K-Sensitivity frequency response using H-Infinity for Non-Minimum Phase . . . . .	44
56	Uncertainty Weighting Function W1 for Non-Minimum phase . . . . .	44
57	Uncertainty Weighting Function W2 for Non-Minimum phase . . . . .	45
58	Uncertainty Weighting Function W3 for Non-Minimum phase . . . . .	45
59	Sensitivity functions and complementary sensitivity functions for the minimum-phase setting . . . . .	46
60	Sensitivity functions and complementary sensitivity functions for the Non-minimum-phase setting . . . . .	46
61	Minimum phase PI Controller . . . . .	47
62	Non-Minimum Phase PI Controller . . . . .	48
63	Loop Shaping Sensitivity and Complementary sensitivity . . . . .	49
64	Open Loop Responses in Non-Minimum Phase . . . . .	50
65	Open Loop Responses in Minimum Phase . . . . .	50
66	A simulated comparison of commanded reference input to tank fluid height QTP. . . . .	51
67	Simulated tank fluid height responses . . . . .	51
68	Actual comparison of commanded reference input to tank fluid height. . . . .	52
69	Actual tank fluid height responses . . . . .	52

70	Minimum phase Kalman Step Response. . . . .	53
71	Minimum phase LQG Step Response . . . . .	53
72	Minimum phase H-Infinity Step Response . . . . .	54
73	Minimum phase LQG Disturbance Rejection. . . . .	54
74	Minimum phase H-Infinity Disturbance Rejection . . . . .	55

## Tables

1	Input, Output and State Variable . . . . .	6
2	Input, Output and State Variable . . . . .	8
3	Nominal Parameter Values . . . . .	8
4	Nominal Parameter Values . . . . .	8
5	Parameter Values for Linear Model . . . . .	12
6	Parameter Values for Linear Model . . . . .	12
7	Time Constant Values . . . . .	13
8	Performance Parameter Analysis . . . . .	56

## 1 Overview

The plant analyzed in this report is the Quadruple Tank Apparatus, also called as the four tank process. This system has two inputs which are the voltages to the two pumps. The outputs are the liquid levels in the bottom two tanks. This process has four states which are the levels in all the four tanks. I reviewed the literature related to this apparatus and shortlisted some characteristics which were essential for our project. This plant has two operating points(Minimum and Non-minimum phase) and I have analysed both the cases in this report. The control designs analysed are LQR, Kalman Filter, LQG, H-Infinity. Through this project opportunity I was able to work on designing controllers and especially designing them for real world systems. I wish to mention that LQR was effective for this plant whereas LQG was tedious to design according to the required specifications. There was a tradeoff between the peak values of Sensitivity and Complementary Sensitivity, aswell as between the overshoot and the settling time for different control designs.

## 2 Relevant Literature

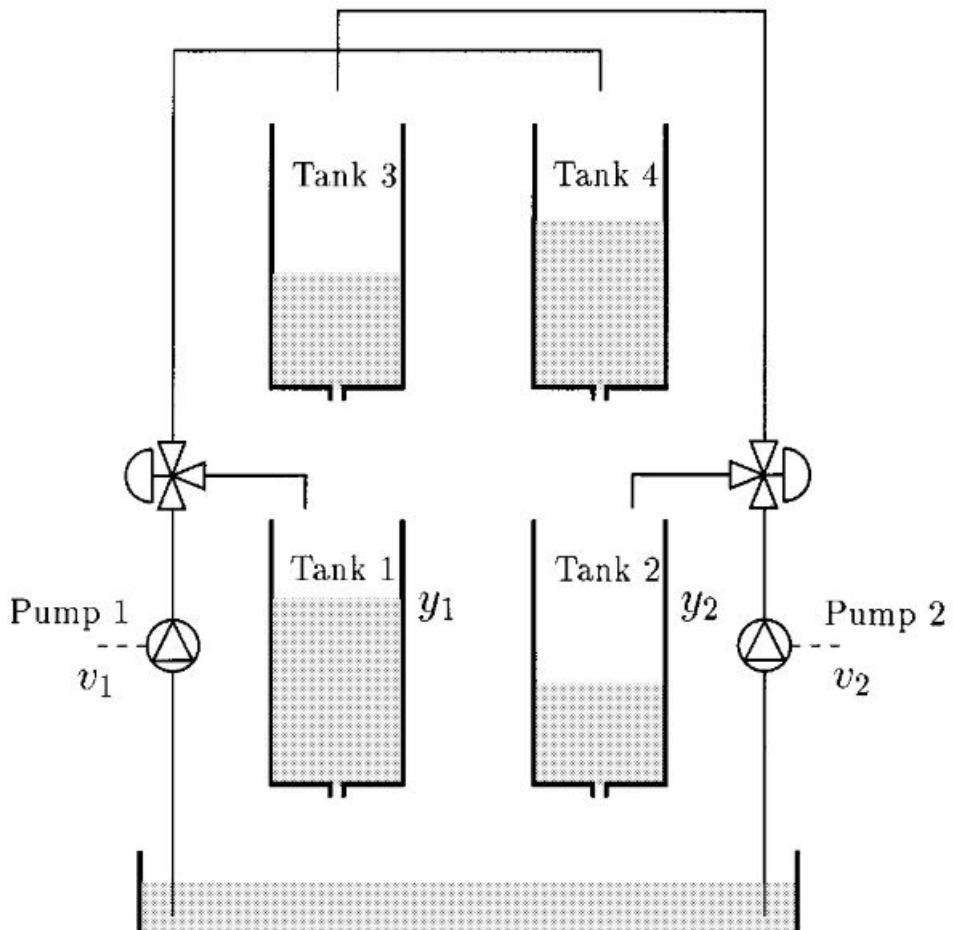
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### 3 Description of MIMO system to be controlled

#### 3.1 Introduction

The quadruple tank process is a **two-input, two-output**(TITO) system with a movable zero composed of the interconnection of two double tank processes. The two inputs are the voltages of the two water pumps, and the two outputs are the water levels of the two lower tanks[7] p.4. The quadruple-tank process's linearized model has a multivariable zero, located in either the left or the right-half-plane, by simply changing a valve [11] p.1. The output of each pump is split into two using a three-way valve. Pump 1 is shared by tank 1 and tank 3, while pump 2 is shared by tank 2 and tank 4. Thus, each pump output goes to two tanks, one lower other one into the upper diagonal tank and the flow to these tanks are controlled by the position of the valve represented as  $\gamma$ . The position of the two valves determines whether the system is in the minimum phase or in the non- minimum phase [8] p.2.

#### 3.2 Figure of Quadruple Tank Apparatus



[11]p.2

Figure 1: Quadruple Tank Apparatus

### 3.3 Relevant Model Information

Variables	Parameters	units	Definition
Inputs	$(v_1, v_2)$	Volts(V)	Voltages applied to pump 1 and pump 2
Outputs	$(h_1, h_2)$	Centimeters(Cm)	Level of the liquid in tank 1 and tank 2
States	$(h_1, h_2, h_3, h_4)$		Levels in all four tanks

Table 1: Input, Output and State Variable

Inputs:

- The two Inputs of this system are the voltages applied to the two respective pumps[Pump 1 and Pump 2] $(v_1, v_2)$ .The voltage applied to the pumps is measured in Volts(V).

Outputs:

- The two Outputs of this system are the levels of liquid in the lower two tanks [Tank 1 and Tank 2]  $(y_1, y_2)$ . The level in the tanks are measured in Centimeters(cm).

States:

- This system has four states which are the levels of the liquid in the four tanks[Tank 1, Tank 2, Tank 3, Tank 4].

Variables:

- Manipulated Variables: The manipulated variables are the valve positioning and the pump flow rates [14]p.12.
- Controlled Variables: The level in this process that we want to control, which can be made to follow any pattern or kept constant [14]p.12.
- Load disturbances: This is the flow rate that is entering the Four-tank process. They are usually set by the upstream or downstream parts of the process which is at the valve position, and our control system should be designed in such a way that it keeps the Four-tank process under control not been influenced by the disturbances [14]p.12.

### 3.4 Key Issues in Controlling this system / Fundamental Performance limitations

Sources of uncertainty in the four-tank system include [13]p.5 :-

- (1) unmodeled and neglected dynamics;
  - (2) valve position uncertainty, which affects the ratios of flows across the top and bottom tanks;
  - (3) uncertainty in the actuators; and
  - (4) non-linearities in the system.
- Right half-plane zeros impose restrictions on the sensitivity function because if the sensitivity is forced to be small in one of the frequency bands, it will be large in the other leading to a bad performance.[9]
  - The achievable bandwidth for closed-loop performance is limited by input saturation and the location of the Right half plane zero. [13]p.5.
  - High uncertainty at steady state causes limitations on the steady-state performance of the system [13]p.5.
  - Back-flow problem is observed with the valves after the pumps have been OFF resulting in all the water flowing into only one of the tanks.Pump voltage is turned on high for a couple of seconds and then turned back down to the equilibrium level to overcome this problem [7]p.6.
  - Pump Saturation:- The voltage range sets a limit on the control systems ability to control the level of liquid in the lower tanks. In cases when a rapid increase or decrease in the level is required it can command an input outside of the voltage specifications of this system[5]p25.
  - Tank Level Saturation:-
    - The upper and lower tanks have identical volume with orifices located at the bottom of each tank, these orifices are adjustable in diameters allowing for increased and decreased draining of

each tank.

- When a drastic increase in fluid height is commanded in the bottom tank a rapid inflow of fluid is introduced to the upper tank, because the flow into the tank can be much greater than the flow out, due to orifice size, a scenario can occur where the tracking system commands a higher height in the upper tank than is physically possible[5]p26.

### 3.5 Reasonable Control System Design Specifications

- The input and output voltages are considered between 0-10 [V] [8]p.2.
- The settling time is ten times longer for the non-minimum. The offset of the tanks ranges in the value from -0.6cm to 2cm [11]pp.7-8.
- The dynamics of this system is accurate but a delay is added due to the length of the tubes. The gain model is correct for water levels at 10cm, but the gain for the real system is higher between 12-14cm [4]p.33.
- The height of each tank is 20 cm and the diameter is about 6 cm. The pumps are gear pumps with a capacity of 2.5 l/min. The tanks and the pumps are connected by flexible tubings, each with a diameter of 6 mm [11]p.3.

## 4 Non-Linear Model of the System

### 4.1 Variable Definitions and Nominal Values

Variables	Parameters	units	Definition
Inputs	( $v_1, v_2$ )	Volts(V)	Voltages applied to pump 1 and pump 2
Outputs	( $h_1, h_2$ )	Centimeters(Cm)	Level of the liquid in tank 1 and tank 2
States	( $h_1, h_2, h_3, h_4$ )		levels in all four tanks

Table 2: Input, Output and State Variable

Parameters	units	Nominal Values	State/Parameters
$A_1, A_3$	[cm <sup>2</sup> ]	28	Areas of the tanks
$A_2, A_4$	[cm <sup>2</sup> ]	32	Areas of the tanks
$a_1, a_3$	[cm <sup>2</sup> ]	0.071	Area of the drain in tank $i$
$a_2, a_4$	[cm <sup>2</sup> ]	0.057	Area of the drain in tank $i$
$k_c$	[V/cm]	0.50	
$g$	[cm/s <sup>2</sup> ]	981	Gravitational Constant

Table 3: Nominal Parameter Values

Symbols	units	$P_-$	$P_+$	States/Parameters
( $h_1^0, h_2^0$ )	[cm]	(12.4, 12.7)	(12.6, 13.0)	Nominal levels
( $h_3^0, h_4^0$ )	[cm]	(1.8, 1.4)	(4.8, 4.9)	Nominal levels
( $v_1^0, v_2^0$ )	[V]	(3.00, 3.00)	(3.15, 3.15)	Nominal pump setting
( $k_1, k_2$ )	[cm <sup>3</sup> /Vs]	(3.33, 3.35)	(3.14, 3.29)	pump proportionality constant
( $\gamma_1, \gamma_2$ )		(0.70, 0.60)	(0.43, 0.34)	ratio of flows in the valves
( $T_1, T_2$ )		(62, 90)	(63, 91)	Time constants
( $T_3, T_4$ )		(23, 30)	(39, 56)	Time constants

Table 4: Nominal Parameter Values

### 4.2 Model Development

• Modelling of a process is required to investigate how the behaviour of a process changes with time under influence of changes in the external disturbances and manipulated variables, to consequently design an appropriate controller. The representation is given in terms of a set of mathematical equations which gives the dynamic behaviour of the process [8]p.3.

• For each tank  $i=1\dots 4$ , the mathematical modelling is done by consideration of mass balance equation and Bernoulli's law yields:

[Rate of Accumulation of Mass in System] = [Mass flow rate into the system] – [Mass flow out of the system]. Some considerations before deriving the mathematical equation of the systems [8]p.3:

• The input to the pump 1 be  $v_1$  and for pump 2 be  $v_2$ .

• The valve priority set for the flow is  $\gamma_1 \gamma_2 \sum [0, 1]$ .

• The flow through the pump 1 when  $v_1$  voltage is applied is  $k_1 v_1$  and for pump 2 when  $v_2$  voltage is applied is  $k_2 v_2$ .

• The flow through the pump is directly proportional to the input voltage applied for the pump.

• The flow in the tank 1 after crossing the valve 1 is  $\gamma_1 k_1 v_1$  and for tank 2 after crossing the valve 2 is  $\gamma_2 k_2 v_2$ .

• The flow in the tank 4 after crossing the valve 1 is  $(1 - \gamma_1) k_1 v_1$  and for tank 3 after crossing the valve 2 is  $(1 - \gamma_2) k_2 v_2$ .

The non-linear model of the Quadruple tank process is given [8] p.3:

Mass balance equation states that [Rate of accumulation] = [Rate of in-flow] – [Rate of out-flow]

Using the law of conservation of mass,

$$\frac{dm_T}{dt} = m_{in} - m_{out} \quad (1)$$

where,  $m_T$  = mass accumulated in the Tank

$m_{in}$  = input mass flow rate

$m_{out}$  = output mass flow rate

Mass accumulated,  $m_T$  = volume of tank ( $v$ ) \* density of liquid in the tank ( $\rho$ )

Input mass flow rate ( $m_{in}$ ) = volumetric flow rate ( $q_{in}$ ) \* density of liquid in the inlet stream ( $\rho_1$ )

Output mass flow rate ( $m_{out}$ ) = volumetric flow rate ( $q_{out}$ ) \* density of liquid in the outlet stream ( $\rho_2$ )

$$\frac{d\rho v}{dt} = \rho_1 q_{in} - \rho_2 q_{out} \quad (2)$$

Modelling of non-linear Quadruple tank process is [8] pp.3-4:

$$A_i \frac{dh_i}{dt} = q_{in_i} - q_{out_i} \quad (3)$$

Where  $A_i$  denotes the cross sectional area of the tank,  $h_i$  is the water level,  $q_{out_i}$  is the in-flow of the tank and  $q_{out_i}$  is out-flow of the tank  $i=1\dots4$ .

The  $q_{in_i}$  only depends on the input voltage supplied to the pump and the  $q_{out_i}$ , depends on the acceleration due to gravity and the head of the water in the tank. The  $q_{out_i}$  can be determined by the using Bernoulli's equation and flow rate of the liquid.

Therefore,

$$\begin{aligned} q_{in_1} &= k_1 V_{11} \\ q_{in_2} &= k_2 V_{22} \\ q_{in_3} &= k_2 V_2 (1-2) \\ q_{in_4} &= k_1 V_1 (1-1) \end{aligned}$$

Where  $k_1, k_2$  are the pumps constant,  $V_1, V_2$  are the velocities of the flow of water through pump 1 and pump 2,  $\gamma_1 \gamma_2$  are the valve ratios.

$$q_{out_i} = a_i \sqrt{2gh_i} \quad (4)$$

Where,  $a_i$  = cross sectional area of the outlet pipes,  $g$  = acceleration due to gravity,  $h_i$  = represents level of the water in each tanks  $i=1\dots4$ .

### Tank 1

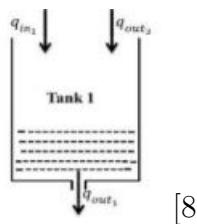


Figure 2: Mass-balance equation for Tank 1

Using the law of conservation of mass, [Rate of accumulation] = [Rate of in-flow] – [Rate of out-flow]

$$A_1 \frac{dh_1}{dt} = q_{in_1} + q_{out_3} - q_{out_1} = \gamma_1 k_1 V_1 + a_3 \sqrt{2gh_3} - a_1 \sqrt{2gh_1} \quad (5)$$

### Tank 2

Using the law of conservation of mass, [Rate of accumulation] = [Rate of in-flow] – [Rate of out-flow]

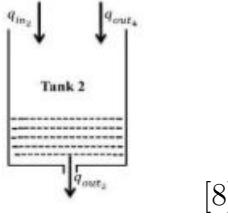


Figure 3: Mass-balance equation for Tank 2

$$A_2 \frac{dh_2}{dt} = q_{in_2} + q_{out_4} - q_{out_2} = \gamma_2 k_2 V_2 + a_4 \sqrt{2gh_4} - a_2 \sqrt{2gh_2} \quad (6)$$

### Tank 3

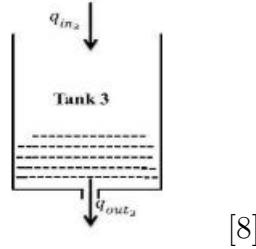


Figure 4: Mass-balance equation for Tank 3

Using the law of conservation of mass, [Rate of accumulation] = [Rate of in-flow] – [Rate of out-flow]

$$A_3 \frac{dh_3}{dt} = q_{in_3} - q_{out_3} = (1 - \gamma_2) k_2 V_2 - a_3 \sqrt{2gh_3} \quad (7)$$

### Tank 4

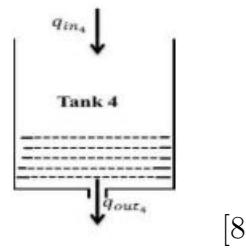


Figure 5: Mass-balance equation for Tank 4

Using the law of conservation of mass, [Rate of accumulation] = [Rate of in-flow] – [Rate of out-flow]

$$A_4 \frac{dh_4}{dt} = q_{in_4} - q_{out_4} = (1 - \gamma_1) k_1 V_1 - a_4 \sqrt{2gh_4} \quad (8)$$

The Final equations are given by,

$$\begin{aligned} \frac{dh_1}{dt} &= -\frac{a_1}{A_1} \sqrt{2gh_1} + \frac{a_3}{A_1} \sqrt{2gh_3} + \frac{\gamma_1 k_1}{A_1} v_1 \\ \frac{dh_2}{dt} &= -\frac{a_2}{A_2} \sqrt{2gh_2} + \frac{a_4}{A_2} \sqrt{2gh_4} + \frac{\gamma_2 k_2}{A_2} v_2 \\ \frac{dh_3}{dt} &= -\frac{a_3}{A_3} \sqrt{2gh_3} + \frac{(1 - \gamma_2) k_2}{A_3} v_2 \\ \frac{dh_4}{dt} &= -\frac{a_4}{A_4} \sqrt{2gh_4} + \frac{(1 - \gamma_1) k_1}{A_4} v_1 \end{aligned} \quad (9)$$

Where the parameters used above are;

$A_i$ :cross-sectional area of Tank  $i$

$a_i$ :cross-sectional area of the outlet hole

$h_i$ :the water level in Tank  $i$

$v_i$ :voltage applied to pump  $i$

$k_i v_i$ :flow from pump  $i$

$g$ :acceleration due to gravity

Johansson[9]p.13 showed that the inverse response (non minimum phase) will occur when  $0 < \gamma_1 + \gamma_2 < 1$  and minimum phase for  $0 < \gamma_1 + \gamma_2 < 2$ .

The valve settings will provide the overall system an entirely different behaviour from a multivariable control point of view.

•Unmeasured disturbances can be applied by pumping water out of the top tanks and into the lower reservoir, this exposes to disturbances rejection as well as reference tracking[13]

## 5 Linear Model

### 5.1 Linearizing the Non-Linear Model

There is a need to linearize the model in order to enhance the stability analysis and controller design. The non-linear model in equation (9) can be linearized around the working point by the levels in the tanks  $h_1^0, h_2^0, h_3^0$  and  $h_4^0$ [14]p.19.

Parameters	units	Values
$A_1, A_3$	[cm <sup>2</sup> ]	28
$A_2, A_4$	[cm <sup>2</sup> ]	32
$a_1, a_3$	[cm <sup>2</sup> ]	0.071
$a_2, a_4$	[cm <sup>2</sup> ]	0.057
$k_c$	[V/cm]	0.50
$g$	[cm/s <sup>2</sup> ]	981

Table 5: Parameter Values for Linear Model

The model and control of the quadruple-tank process are studied at two operating points:  $P_-$  at which the system will have minimum-phase characteristics and  $P_+$  at which it will have non minimum-phase characteristics. The chosen operating points correspond to the following parameter values[11]p.2.

Symbols	units	$P_-$	$P_+$
$(h_1^0, h_2^0)$	[cm]	(12.4, 12.7)	(12.6, 13.0)
$(h_3^0, h_4^0)$	[cm]	(1.8, 1.4)	(4.8, 4.9)
$(v_1^0, v_2^0)$	[V]	(3.00, 3.00)	(3.15, 3.15)
$(k_1, k_2)$	[cm <sup>3</sup> /Vs]	(3.33, 3.35)	(3.14, 3.29)
$(\gamma_1, \gamma_2)$		(0.70, 0.60)	(0.43, 0.34)

Table 6: Parameter Values for Linear Model

Using Taylor Series applications, a linearized state-space model form  $x_i = h_i - h_i^0$  and control variables  $u_i = v_i - v_i^0$  for equation (9) can be represented as given below:

$$\dot{X}_p = \begin{bmatrix} -\frac{1}{T_1} & 0 & \frac{a_3}{a_1 T_3} & 0 \\ 0 & -\frac{1}{T_2} & 0 & \frac{a_4}{a_2 T_4} \\ 0 & 0 & -\frac{1}{T_3} & 0 \\ 0 & 0 & 0 & -\frac{1}{T_4} \end{bmatrix} X_p + \begin{bmatrix} \frac{\gamma_1 k_1}{A_1} & 0 \\ 0 & \frac{\gamma_2 k_2}{A_2} \\ 0 & \frac{(1-\gamma_2)k_2}{A_3} \\ \frac{(1-\gamma_1)k_1}{A_4} & 0 \end{bmatrix} u_p \quad (10)$$

$$Y_p = \begin{bmatrix} k_c & 0 & 0 & 0 \\ 0 & k_c & 0 & 0 \end{bmatrix} X_p \quad (11)$$

where  $x = [h_1 \ h_2 \ h_3 \ h_4]^T$ ,  $u = [v_1 \ v_2]^T$  and  $y = [h_1 \ h_2]^T$   
the time constants are

$$T_i = \frac{A_i}{a_i} \sqrt{\frac{2h_i^0}{g}}, \quad i = 1, \dots, 4 [11]p.3 \quad (12)$$

The corresponding transfer matrix is

$$G(s) = \begin{bmatrix} \frac{\gamma_1 c_1}{1+sT_1} & \frac{(1-\gamma_2)c_1}{(1+sT_3)(1+sT_1)} \\ \frac{(1-\gamma_1)c_2}{(1+sT_4)(1+sT_2)} & \frac{\gamma_2 c_2}{1+sT_2} \end{bmatrix} [11]p.2 \quad (13)$$

where  $c_1 = T_1 k_1 k_c / A_1$  and  $c_2 = T_2 k_2 k_c / A_2$ . The two operating points  $P_-$  and  $P_+$  we have the following time constants [11]p.3:

<i>Time constants</i>	$P_-$	$P_+$
$(T_1, T_2)$	(62, 90)	(63, 91)
$(T_3, T_4)$	(23, 30)	(39, 56)

Table 7: Time Constant Values

## 5.2 State space representation of Plant at Minimum Phase

$$A_P \text{ min phase} = \begin{bmatrix} -0.0161 & 0 & 1.2174 & 0 \\ 0 & -0.0111 & 0 & 0.0333 \\ 0 & 0 & -0.0435 & 0 \\ 0 & 0 & 0 & -0.0333 \end{bmatrix} \quad B_P \text{ min phase} = \begin{bmatrix} 0.0833 & 0 \\ 0 & 0.0628 \\ 0 & 0.0479 \\ 0.0312 & 0 \end{bmatrix}$$

$$C_P \text{ min phase} = \begin{bmatrix} 0.5000 & 0 & 0 & 0 \\ 0 & 0.5000 & 0 & 0 \end{bmatrix} \quad D_P \text{ min phase} = [0]$$

## 5.3 State space representation of Plant at Non-Minimum Phase

$$A_P \text{ non-min phase} = \begin{bmatrix} -0.0159 & 0 & 0.7179 & 0 \\ 0 & -0.0110 & 0 & 0.0179 \\ 0 & 0 & -0.0256 & 0 \\ 0 & 0 & 0 & -0.0179 \end{bmatrix} \quad B_P \text{ non-min phase} = \begin{bmatrix} 0.0482 & 0 \\ 0 & 0.0350 \\ 0 & 0.0775 \\ 0.0559 & 0 \end{bmatrix}$$

$$C_P \text{ non-min phase} = \begin{bmatrix} 0.5000 & 0 & 0 & 0 \\ 0 & 0.5000 & 0 & 0 \end{bmatrix} \quad D_P \text{ non-min phase} = [0]$$

## 6 Analysis of Linear Model: Dynamic Properties

### 6.1 Plant Transfer Function Matrix(TFM)

The transfer function Matrices for the two operating points are given by

$$G_-(s) = \begin{bmatrix} \frac{2.6}{1+62s} & \frac{1.5}{(1+23s)(1+62s)} \\ \frac{1.4}{(1+30s)(1+90s)} & \frac{2.8}{1+90s} \end{bmatrix} \quad (14)$$

and

$$G_+(s) = \begin{bmatrix} \frac{1.5}{1+63s} & \frac{2.5}{(1+39s)(1+63s)} \\ \frac{2.5}{(1+56s)(1+91s)} & \frac{1.6}{1+91s} \end{bmatrix} \quad (15)$$

### 6.2 Bode plots

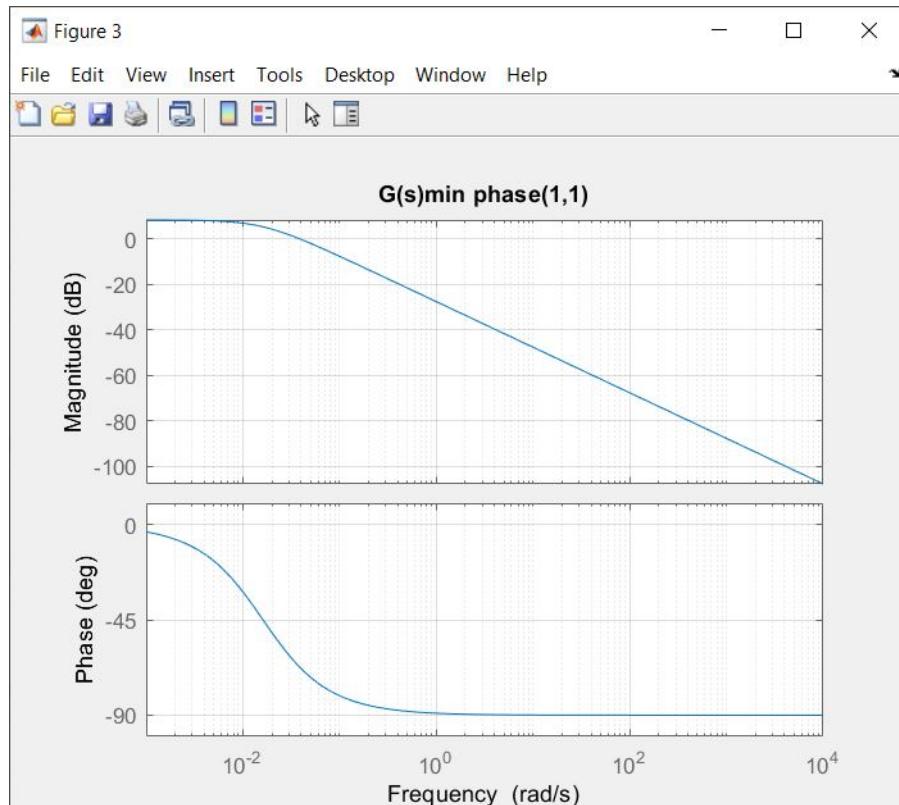


Figure 6: Bode plot of  $G(s)$  min phase (1,1)

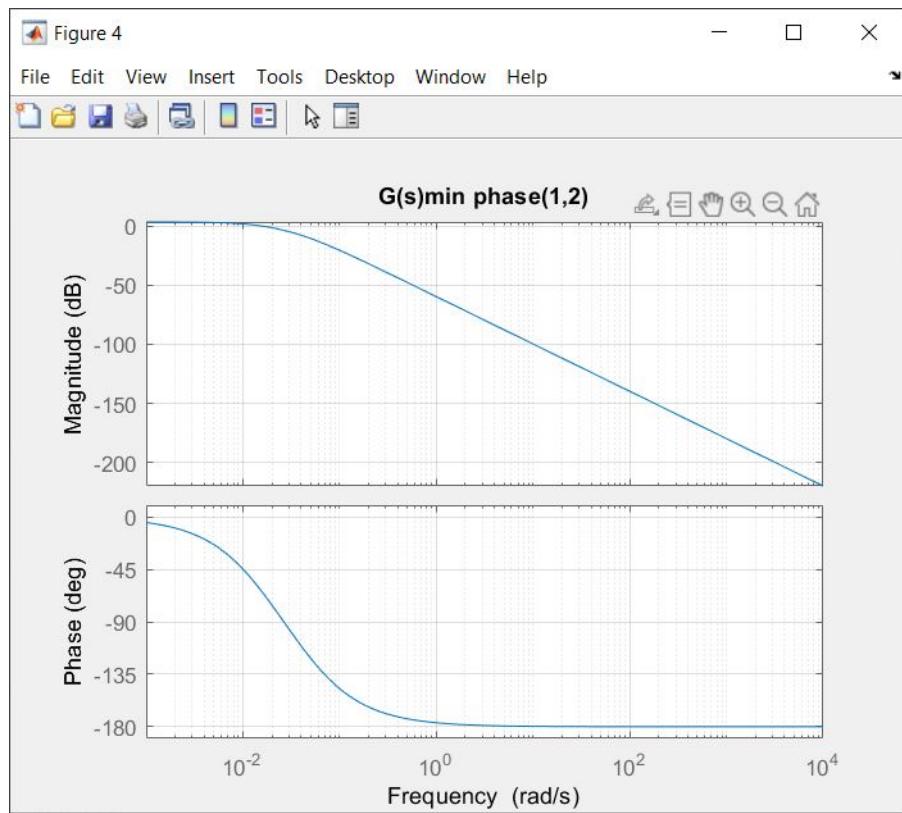


Figure 7: Bode plot of  $G(s)$  min phase (1,2)

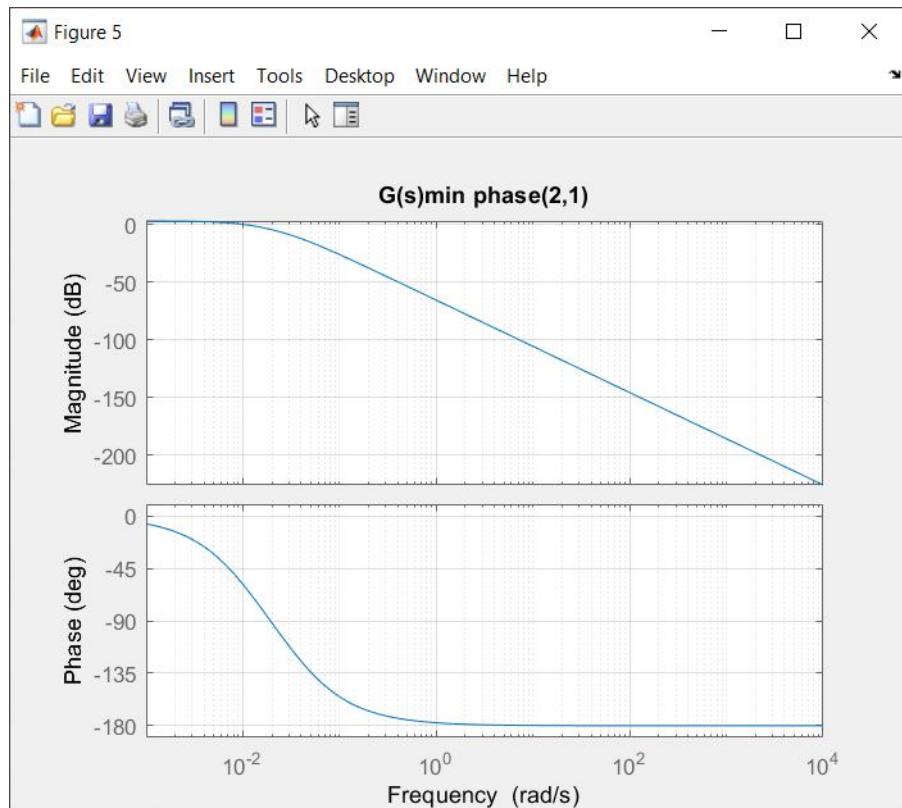


Figure 8: Bode plot of  $G(s)$  min phase (2,1)

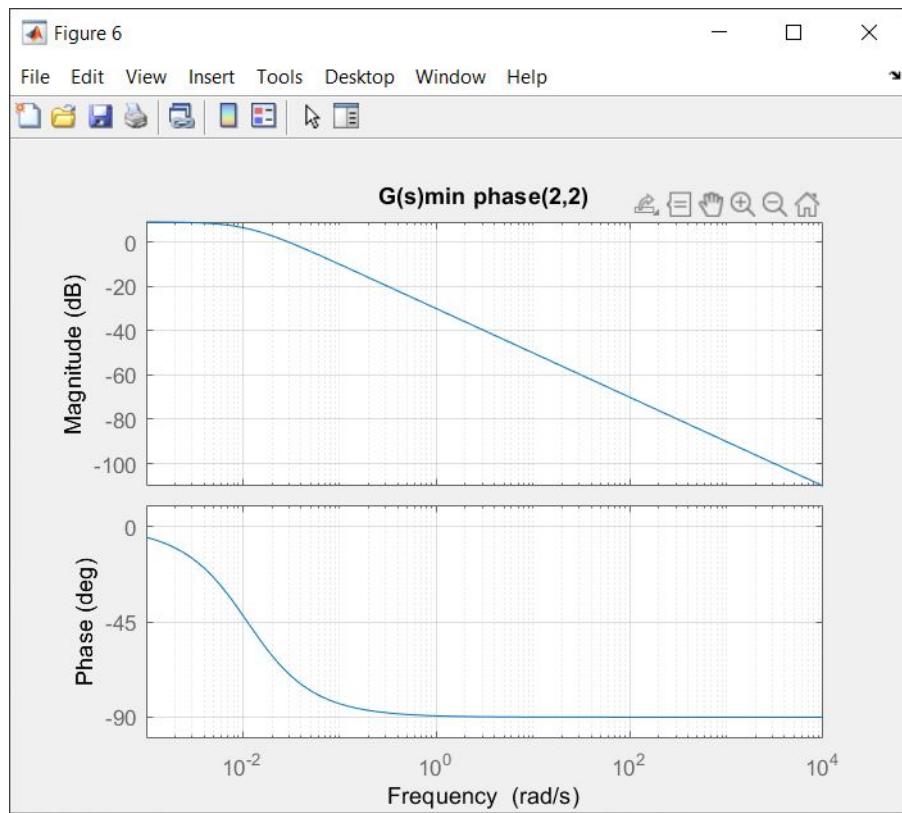


Figure 9: Bode plot of  $G(s)$  min phase (2,2)

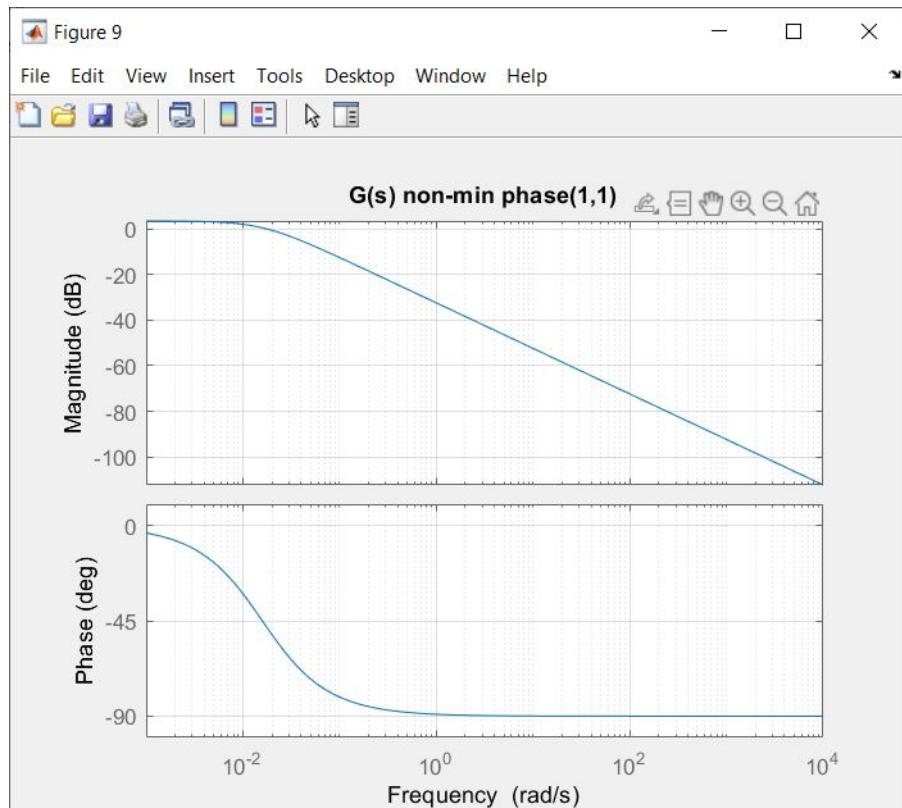


Figure 10: Bode plot of  $G(s)$  non min phase (1,1)

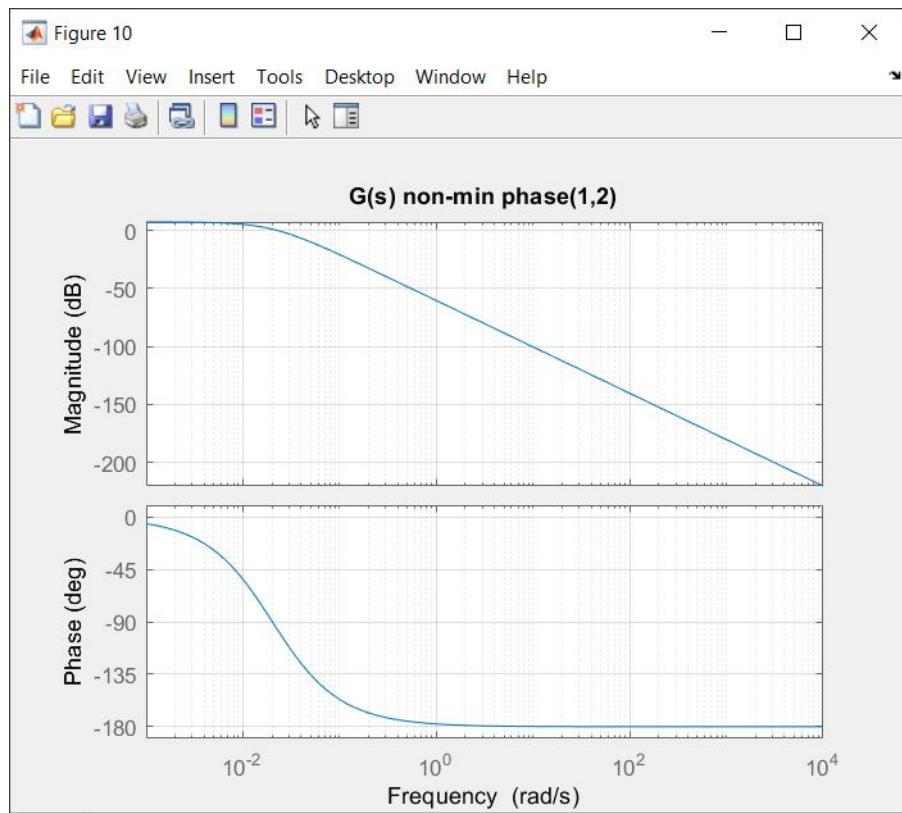


Figure 11: Bode plot of  $G(s)$  non min phase (1,2)

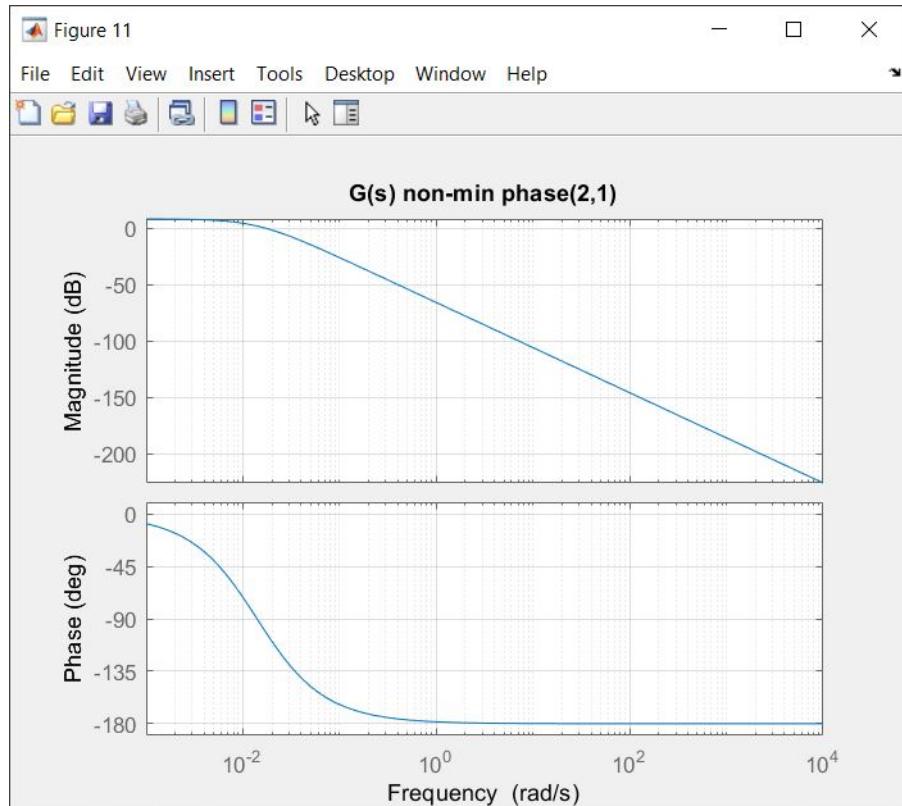


Figure 12: Bode plot of  $G(s)$  non min phase (2,1)

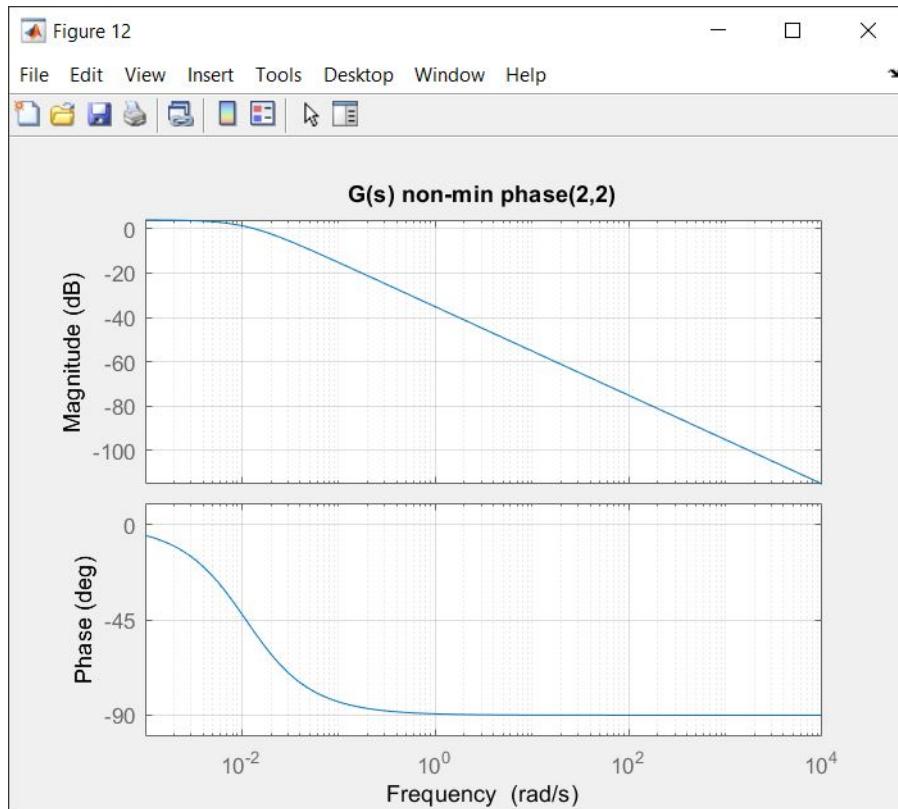


Figure 13: Bode plot of  $G(s)$  non min phase (2,2)

### 6.3 Poles

- Poles and Zeros of a transfer function are the frequencies for which the value of the denominator and numerator of transfer function becomes zero respectively. The values of the poles and the zeros of a system determine whether the system is stable, and how well the system performs.
  - Control systems, in the most simple sense, can be designed simply by assigning specific values to the poles and zeros of the system. Physically realizable control systems must have a number of poles greater than the number of zeros. Systems that satisfy this relationship are called Proper.[3]
  - Poles can be obtained by calculating the eigenvalues of the matrix  $A_p$ .
- The minimum phase has the following poles:  $P_{min} = -0.0161, -0.0435, -0.0333, -0.0111$   
The non-minimum phase has the following poles:  $P_{non-min} = -0.0159, -0.0256, -0.0179, -0.0110$

### 6.4 Stability

- Stability for a MIMO system is defined by the position of the eigenvalues of  $A_p$ , if the eigenvalues are within the unit circle then the system is said to be stable.
- As all the eigenvalues/poles are in the left half plane the system and inside the unit circle the system is stable.

**Eigenvalues of A Minimum Phase** = [ -0.0161, -0.0111, -0.0435, -0.0333]

**Eigenvalues of A Non-minimum Phase** = [ -0.0159, -0.0110, -0.0256, -0.0179]

### 6.5 Transmission Zeros

- The four-tank dynamics has an adjustable multivariable transmission zero such that its position can be in the LHP or the RHP, and it depends on the ratios of the flow rates between the tanks as determined by  $\gamma_1$  and  $\gamma_2$ .
- The position of the multivariable zero is a source of motivation for investigating the performance limitations arising from the right-half plane transmission zeroes<sup>1</sup>. It is also referred to as transmission

zeros.[14]

The zeros of the transfer matrix in (13) are the zeros of the numerator polynomial of the rational function[11]p.4.

$$\begin{aligned} \det G(s) = & \frac{c_1 c_2}{\gamma_1 \gamma_2 \prod_{i=1}^4 (1 + sT_i)} \\ & \times \left[ (1 + sT_3)(1 + sT_4) - \frac{(1 - \gamma_1)(1 - \gamma_2)}{\gamma_1 \gamma_2} \right]. \end{aligned} \quad (16)$$

- The transfer matrix G has two finite zeros for  $\gamma_1$  and  $\gamma_2$  in {0,1}.
- One of them is always in the LHP , but the other can be located either in the left or the right half plane.
- The location of the other zero depends on the sign of  $\eta = a_3 a_4 A_1 A_2 (\gamma_1 + \gamma_2 - 1 - \gamma_1 \gamma_2) + a_1 a_2 A_3 A_4 \gamma_1 \gamma_2$ .
- The multivariable zero is in the right half plane if  $\eta < 0$  and will be in the left half plane if  $\eta > 0$ .

## 6.6 Zero Directions

- In Multivariable systems the direction of the zero also plays an important role [11]p.4.
- The output direction of a zero  $z$  as a vector  $\psi \in R^2$  of unit length such as  $\psi^T G(z) = 0$  . If  $\psi$  is parallel to a unit vector, then the zero is only associated with one output.[11]
- If this is not the case, then the effect of a right half-plane zero may be distributed between both outputs [11].
- For the Transfer function in [13] the zero direction for  $z > 0$  is given by:

$$\begin{bmatrix} \psi_1 \\ \psi_2 \end{bmatrix}^T \begin{bmatrix} \frac{\gamma_1 c_1}{1+zT_1} & \frac{(1-\gamma_2)c_1}{(1+zT_3)(1+zT_1)} \\ \frac{(1-\gamma_1)c_2}{(1+zT_4)(1+zT_2)} & \frac{\gamma_2 c_2}{1+zT_2} \end{bmatrix} = \begin{bmatrix} 0 \\ 0 \end{bmatrix}^T \quad (17)$$

- It follows from this equation that  $\psi_1, \psi_2 \neq 0$ , so that the zero is never associated with only one output.
- If we solve [13] for and simplify, it is easy to show that :

$$\frac{\psi_1}{\psi_2} = -\frac{1 - \gamma_1}{\gamma_1} \cdot \frac{c_2 (1 + zT_1)}{c_1 (1 + zT_4) (1 + zT_2)} \quad (18)$$

- From the above equation it is possible to conclude that if  $\psi_1$  is small, then  $z$  is mostly associated with the first output and if  $\psi_1$  is close to one, then  $z$  is mostly associated with the second output.[11]
- Hence, for a given zero location, the relative size of  $\psi_1$  and  $\psi_2$  determines which output the right half-plane zero is related to.[11]

## 6.7 Pole-Zero plot

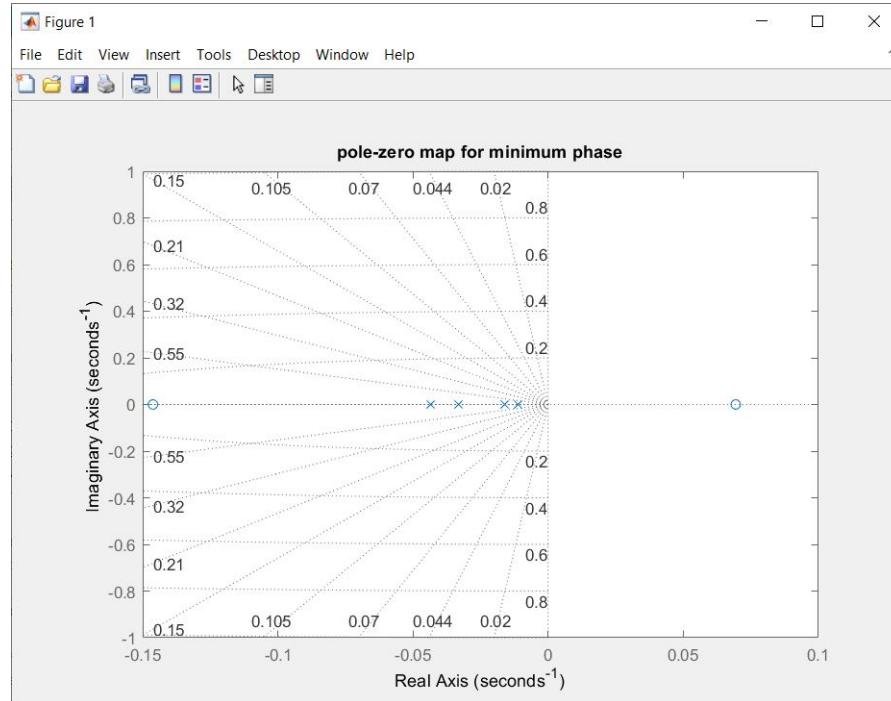


Figure 14: pole-zero plot minimum phase

- The above figure shows the pole zero plot for the first operating point. It shows characteristics similar to a system having Minimum Phase.

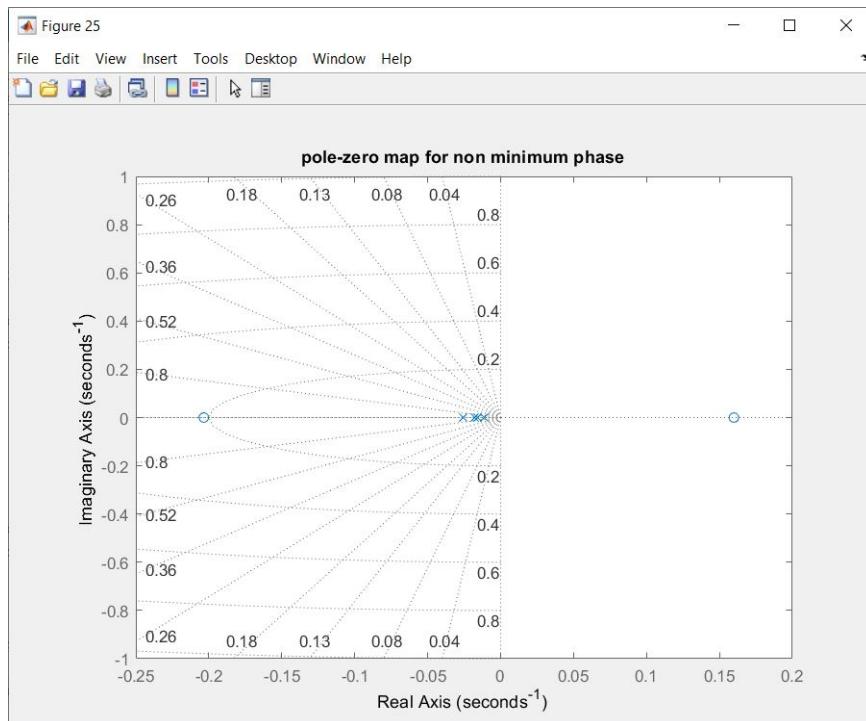


Figure 15: pole-zero plot non-minimum phase

- The above figure shows the pole zero plot for the Second operating point. It shows characteristics similar to a system having Non-Minimum Phase.

## 6.8 Singular Plots

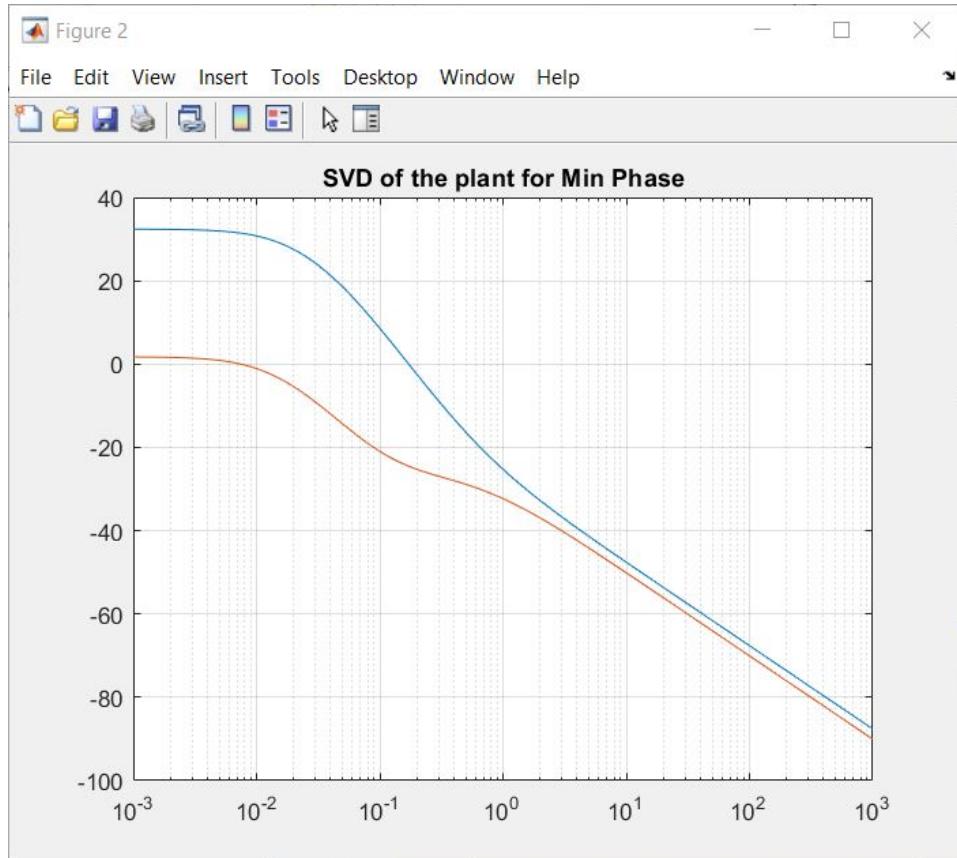


Figure 16: Singular Plot of Plant in Minimum Phase

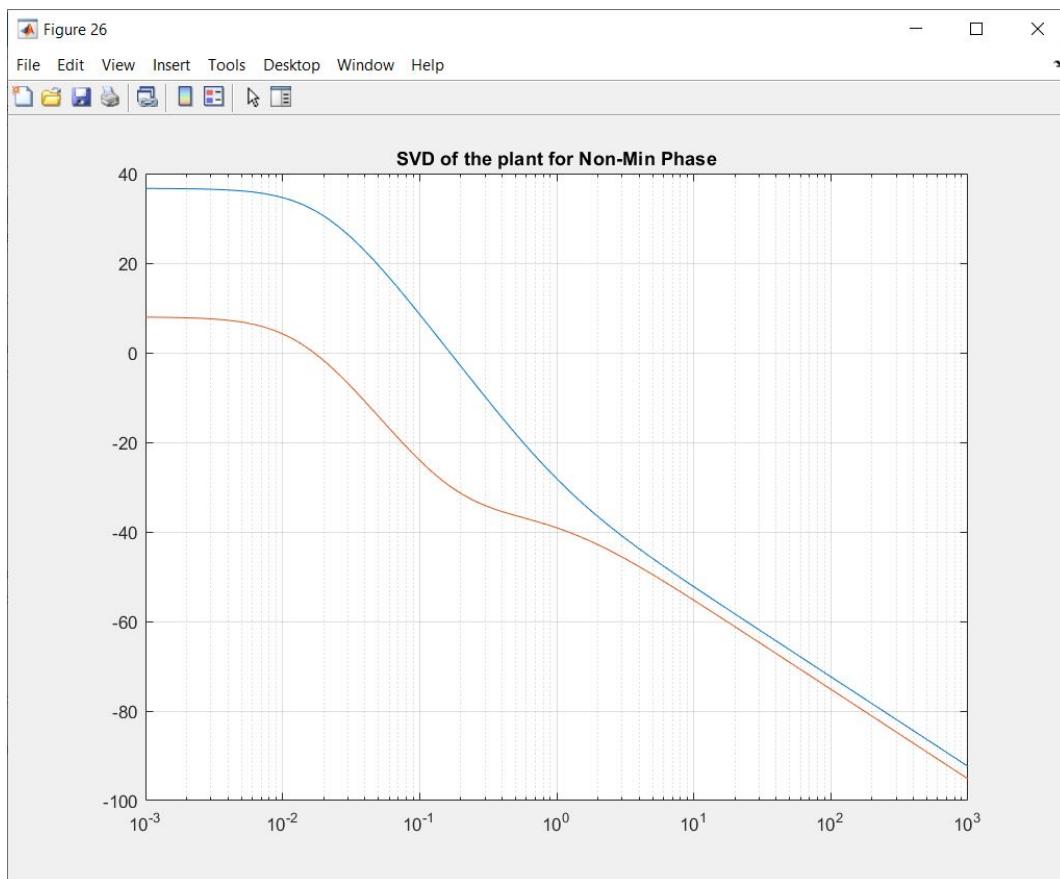


Figure 17: Singular Plot of Plant in Non-Minimum Phase

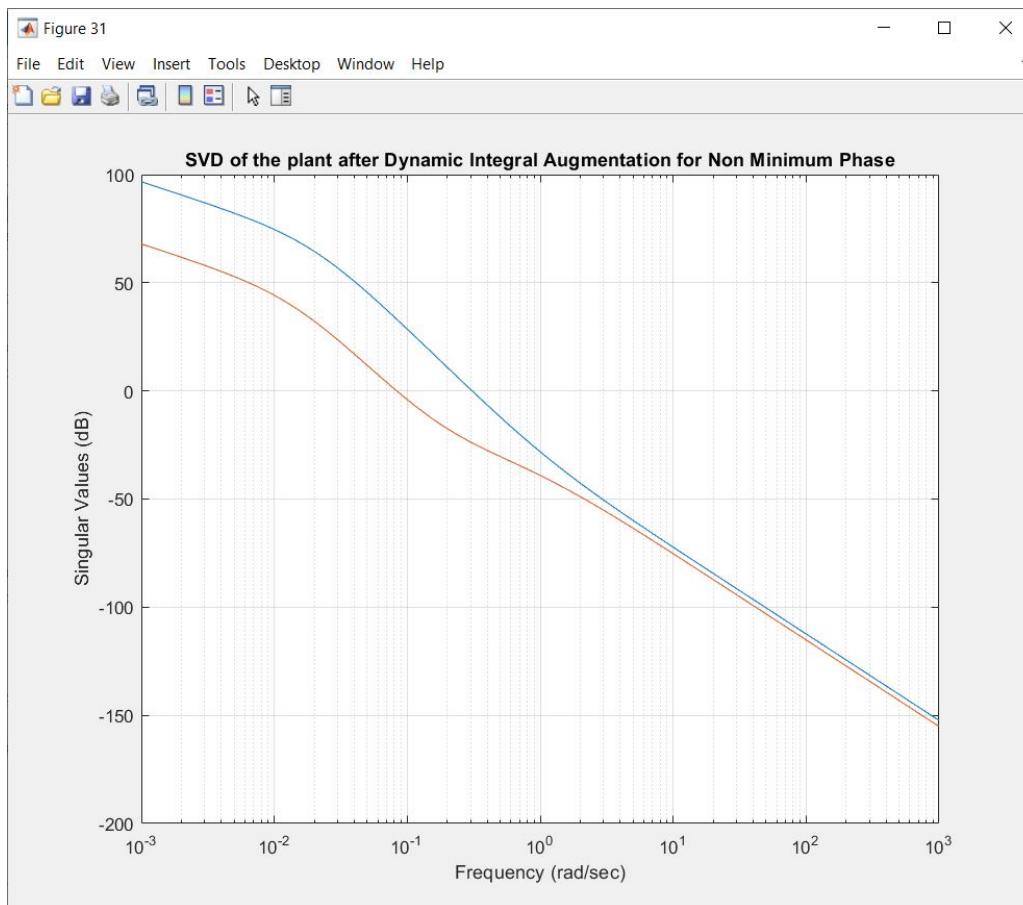


Figure 18: Singular Plot of Plant with Dynamic Augmentation of Integrator

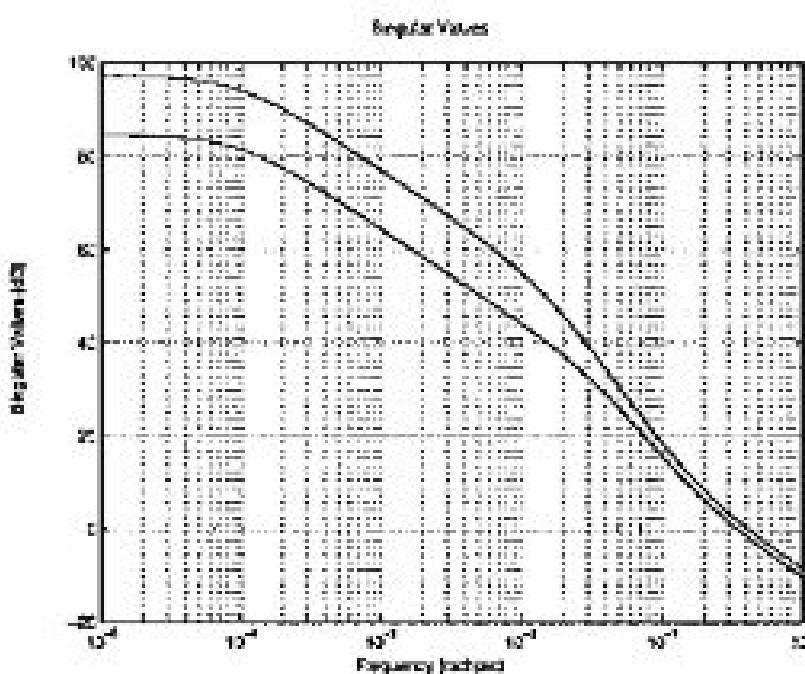


Figure 19: Principal gains of return ratio using the augmented plant [7]

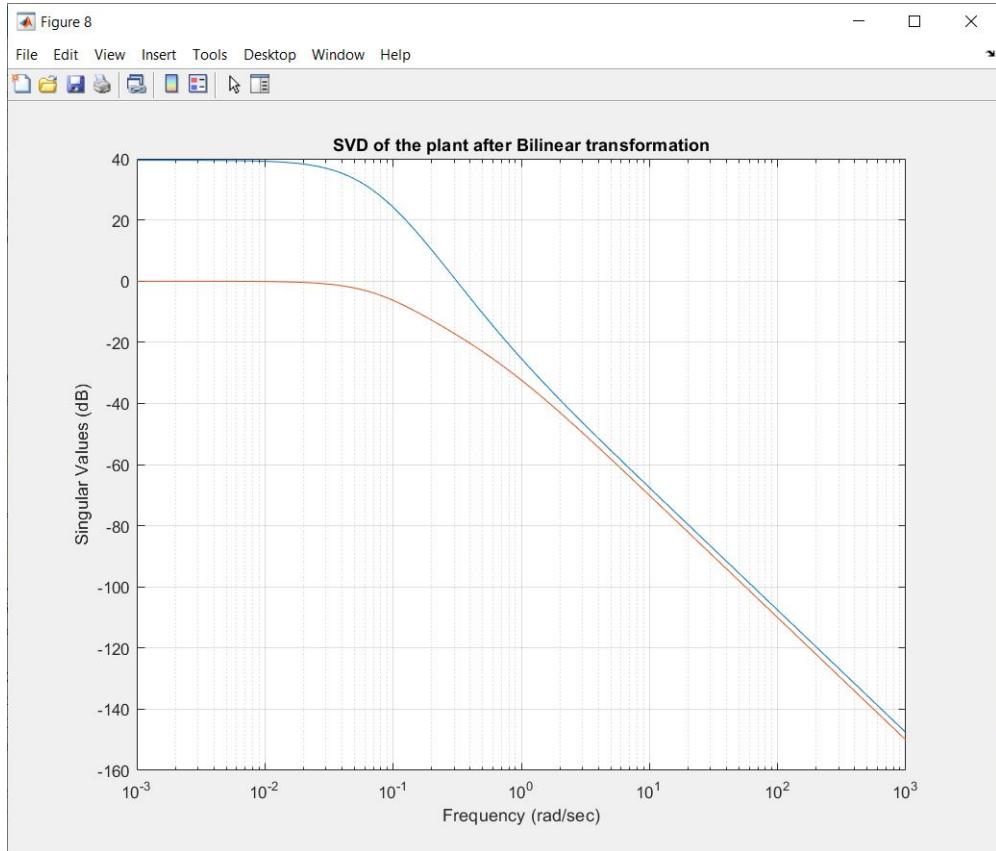


Figure 20: Singular Plot of Plant with Bilinear Transformation for Min Phase

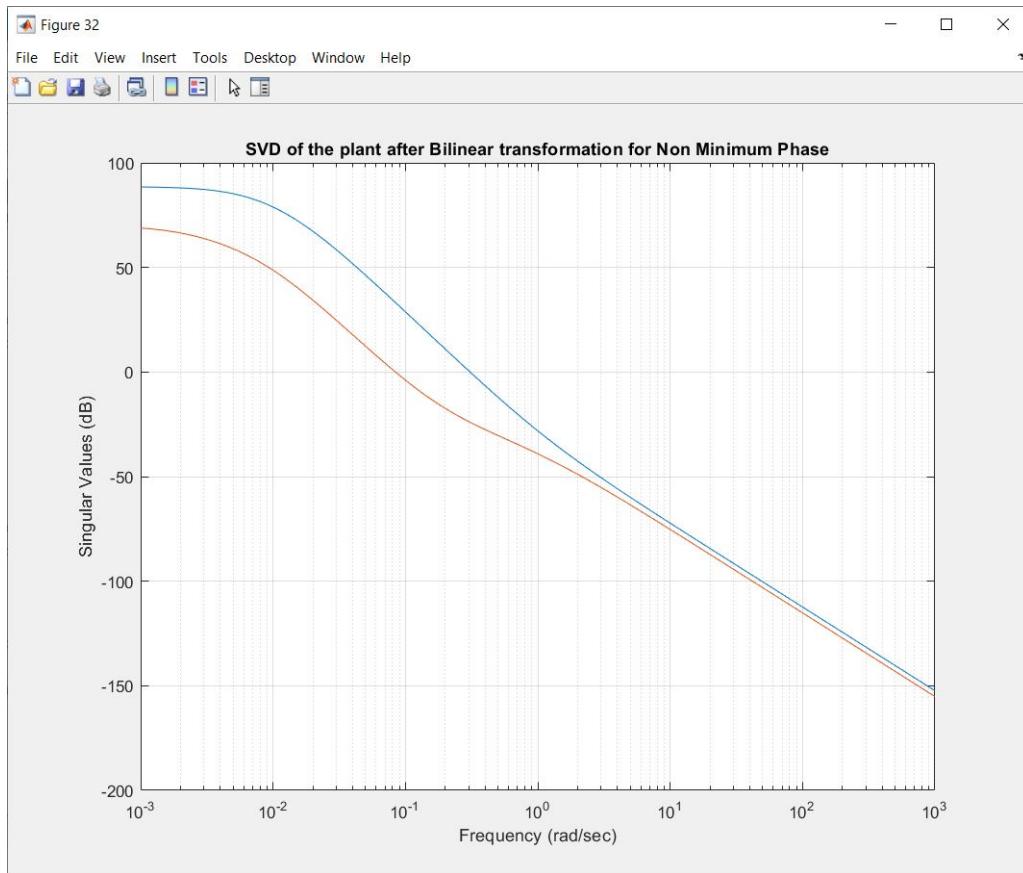


Figure 21: Singular Plot of Plant with Bilinear Transformation for Non-Minimum Phase

## 6.9 Dc Gain Matrix

- The DC Gain matrix for the Quadruple Tank Apparatus for the two operating points are given by:

$$G(s) \text{ minimum phase} = \begin{bmatrix} 2.5808 & 1.4747 \\ 1.4133 & 2.8266 \end{bmatrix} \quad G(s) \text{ non - minimum phase} = \begin{bmatrix} 1.1590 & 2.3314 \\ 2.6664 & 1.5905 \end{bmatrix}$$

- The above matrices shows that the system has its inputs coupled to each other and is not similar to an Single Input Single Output(SISO) system.

## 6.10 Controllability

- Complete state controllability (or simply controllability ) describes the ability of an external input to move the internal state of a system from any initial state to any other final state in a finite time interval.[1]

- The  $n \times np$  controllability matrix is given as  $C = [B \ AB \ A^2B \cdots A^{n-1}B]$

The system is said to be controllable when the rank of the system matrix  $A_p$  is equal to the rank of the controllability matrix C.

$$\text{Controllability minimum phase} = \begin{bmatrix} 0.0833 & 0 & -0.0013 & 0.0583 & 0.0000 & -0.0035 & -0.0000 \\ 0.0002 & & & & & & \\ 0 & 0.0628 & 0.0010 & -0.0007 & -0.0000 & 0.0000 & 0.0000 \\ -0.0000 & & & & & & \\ 0 & 0.0479 & & 0 & -0.0021 & 0 & 0.0001 \\ -0.0000 & & & & & & \\ 0.0312 & 0 & -0.0010 & & 0 & 0.0000 & 0 \\ 0 & & & & & & \end{bmatrix}$$

rank of controllability matrix minimum phase=4

Controllability non minimum phase=

$$\begin{bmatrix} 0.0482 & 0 & -0.0008 & 0.0557 & 0.0000 & -0.0023 & -0.0000 & 0.0001 \\ 0 & 0.0350 & 0.0010 & -0.0004 & -0.0000 & 0.0000 & 0.0000 & -0.0000 \\ 0 & 0.0775 & & 0 & -0.0020 & 0 & 0.0001 & 0 \\ 0.0559 & 0 & -0.0010 & 0 & 0.0000 & 0 & -0.0000 & 0 \end{bmatrix}$$

rank of controllability matrix non-minimum phase = 4

- From above we can say that this system is controllable at both the operating points.

## 6.11 Observability

- A system is said to be observable if, for any possible evolution of state and control vectors, the current state can be estimated using only the information from outputs (physically, this generally corresponds to information obtained by sensors).[2]

$$\bullet \text{The Observability matrix is given as } O = \begin{bmatrix} C \\ CA \\ CA^2 \\ \vdots \\ CA^{n-1} \end{bmatrix}$$

- The system is said to be observable when the rank of the system matrix  $A_p$  is equal to the rank of the Observability matrix O.

$$\text{Observability minimum phase} = \begin{bmatrix} 0.5000 & 0 & 0 & 0 \\ 0 & 0.5000 & 0 & 0 \\ -0.0081 & 0 & 0.6087 & 0 \\ 0 & -0.0056 & 0 & 0.0167 \\ 0.0001 & 0 & -0.0363 & 0 \\ 0 & 0.0001 & 0 & -0.0007 \\ -0.0000 & 0 & 0.0017 & 0 \\ 0 & -0.0000 & 0 & 0.0000 \end{bmatrix}$$

rank of observability matrix minimum phase = 4

$$\text{Observability non minimum phase} = \begin{bmatrix} 0.5000 & 0 & 0 & 0 \\ 0 & 0.5000 & 0 & 0 \\ -0.0079 & 0 & 0.3590 & 0 \\ -0.0055 & 0 & 0.0089 & 0 \\ 0.0001 & 0 & -0.0149 & 0 \\ 0 & 0.0001 & 0 & -0.0003 \\ -0.0000 & 0 & 0.0005 & 0 \\ 0 & -0.0000 & 0 & 0.0000 \end{bmatrix}$$

rank of observability matrix non minimum phase = 4

- From above we can say that this system is observable at both the operating points.

## 7 Control Design

### 7.1 LQR(Linear Quadratic Regulator) Controller

LQR Problem Statement([12]pp.116-117):

$$\min_u J(u) \stackrel{\text{def}}{=} \frac{1}{2} \int_0^{\infty} (x^T Q x + u^T R u) d\tau \quad (19)$$

which is subject to the general state space representation with initial condition  $x(0) = x_0$ , and the assumption that  $(A, B, M)$  is stabilizable and detectable .

Solution: The solution to the LQR problem is a linear full-state feedback control law:

$$u = -Gx \quad (20)$$

where the control gain matrix G in  $R^{m \times n}$  is given by:

$$G = R^{-1} B^T K \quad (21)$$

and  $K$  is the unique symmetric (at least) positive semidefinite solution of the following Control Algebraic Riccati Equation (CARE):

$$0 = KA + A^T K + M^T M - KBR^{-1}B^T K \quad (22)$$

#### 7.1.1 Minimum Phase Characteristics

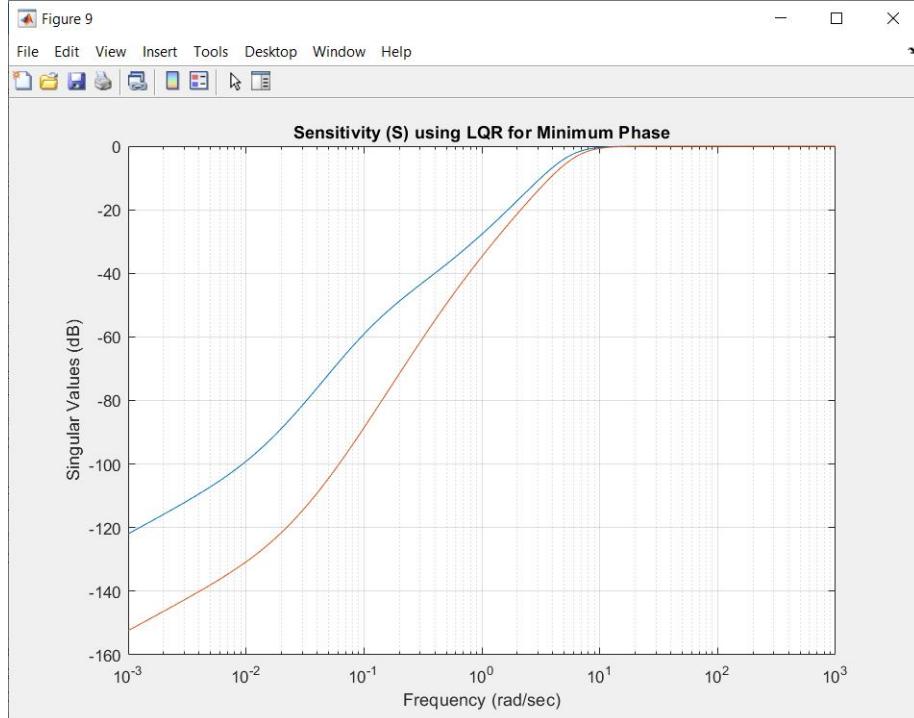


Figure 22: Closed Loop Sensitivity using LQR for Minimum phase

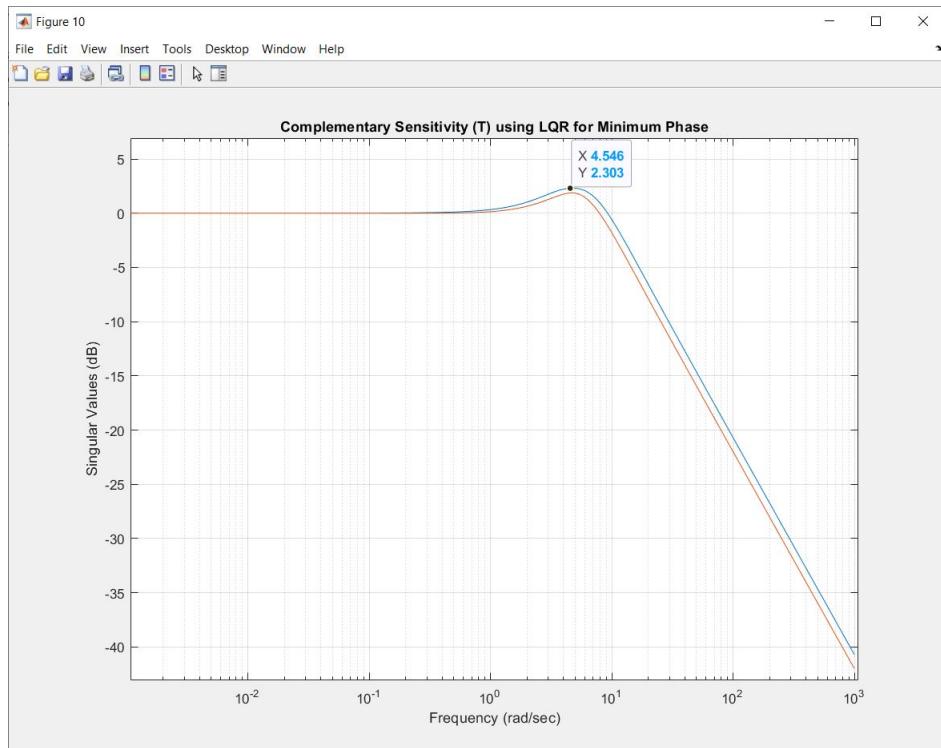


Figure 23: Closed Loop Complementary Sensitivity using LQR for Minimum phase

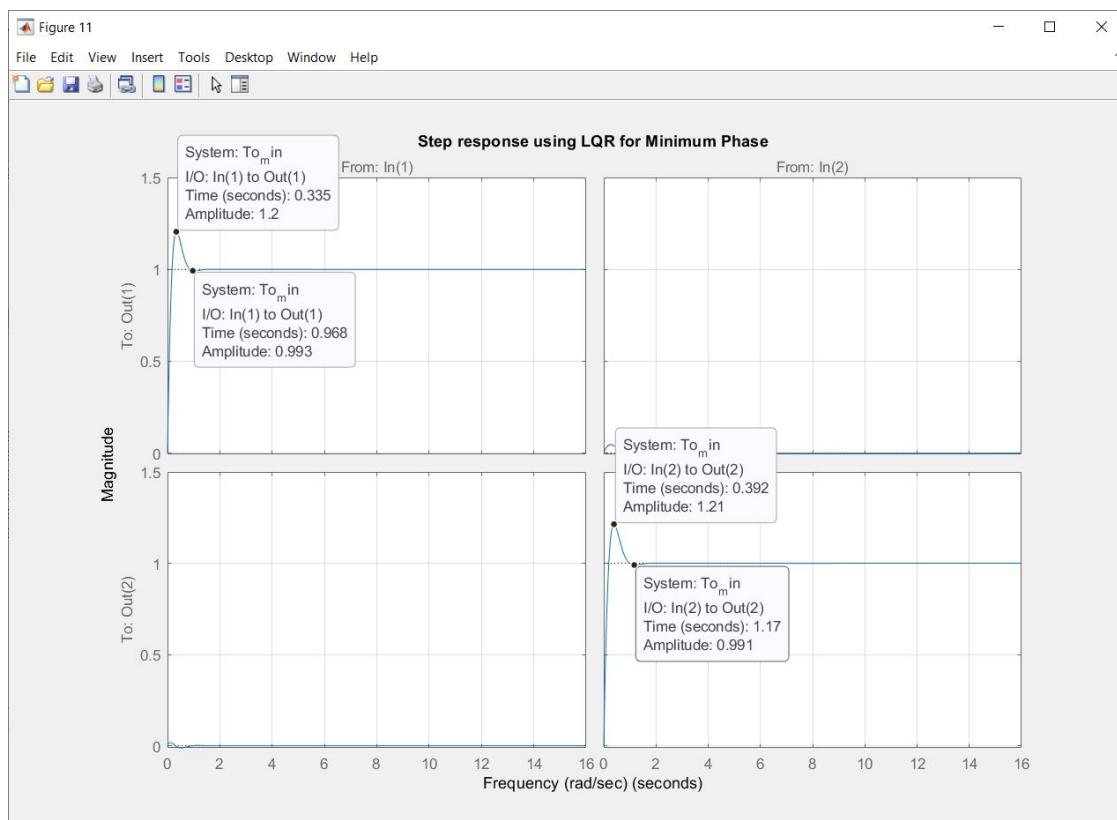


Figure 24: Step Response of LQR for Minimum Phase

### 7.1.2 Non-Minimum Phase Characteristics

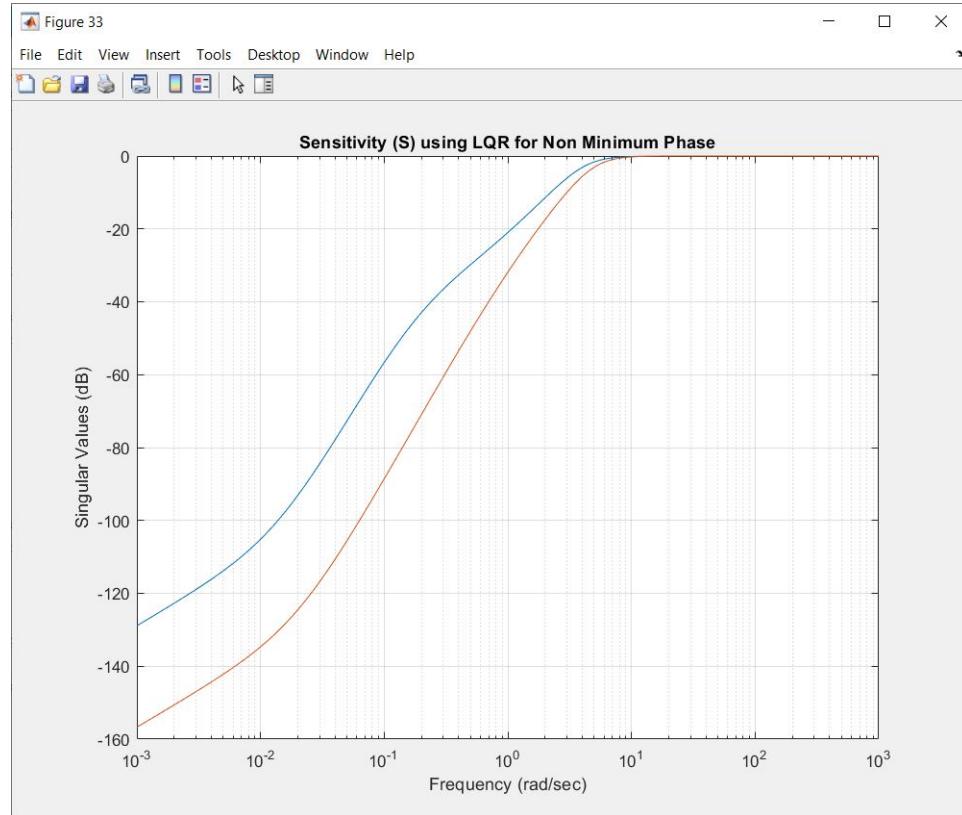


Figure 25: Closed Loop Sensitivity using LQR for Non-Minimum phase

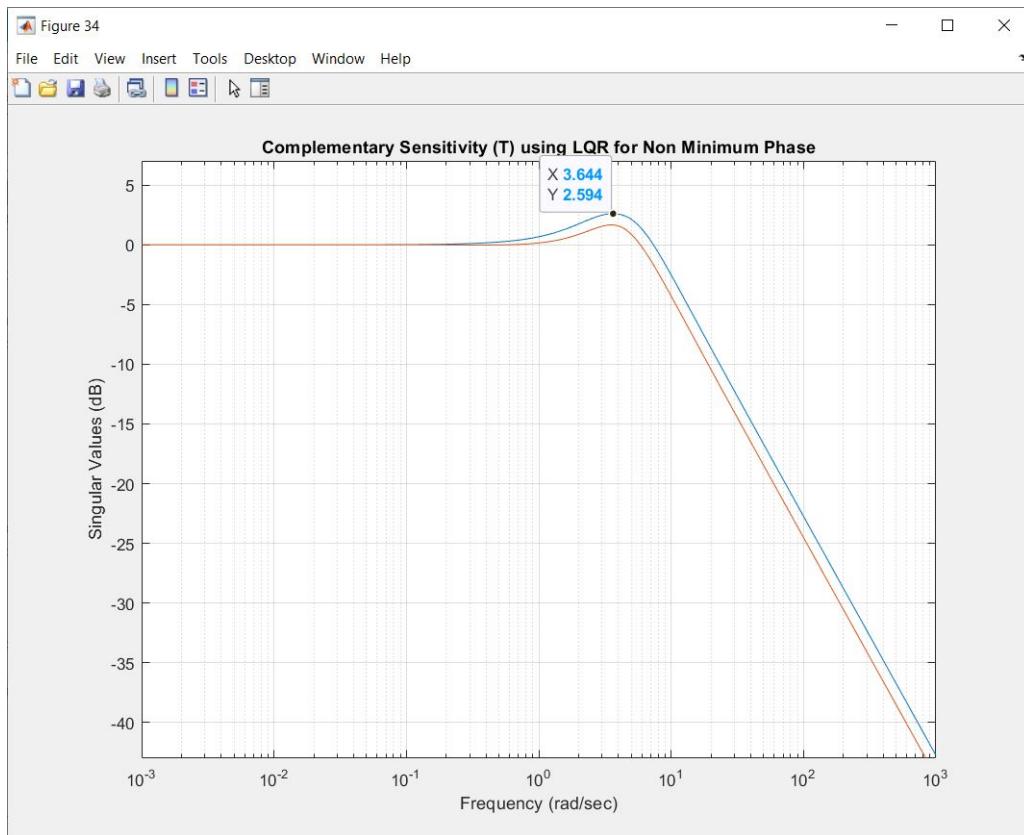


Figure 26: Closed Loop Complementary Sensitivity using LQR for Non-Minimum phase

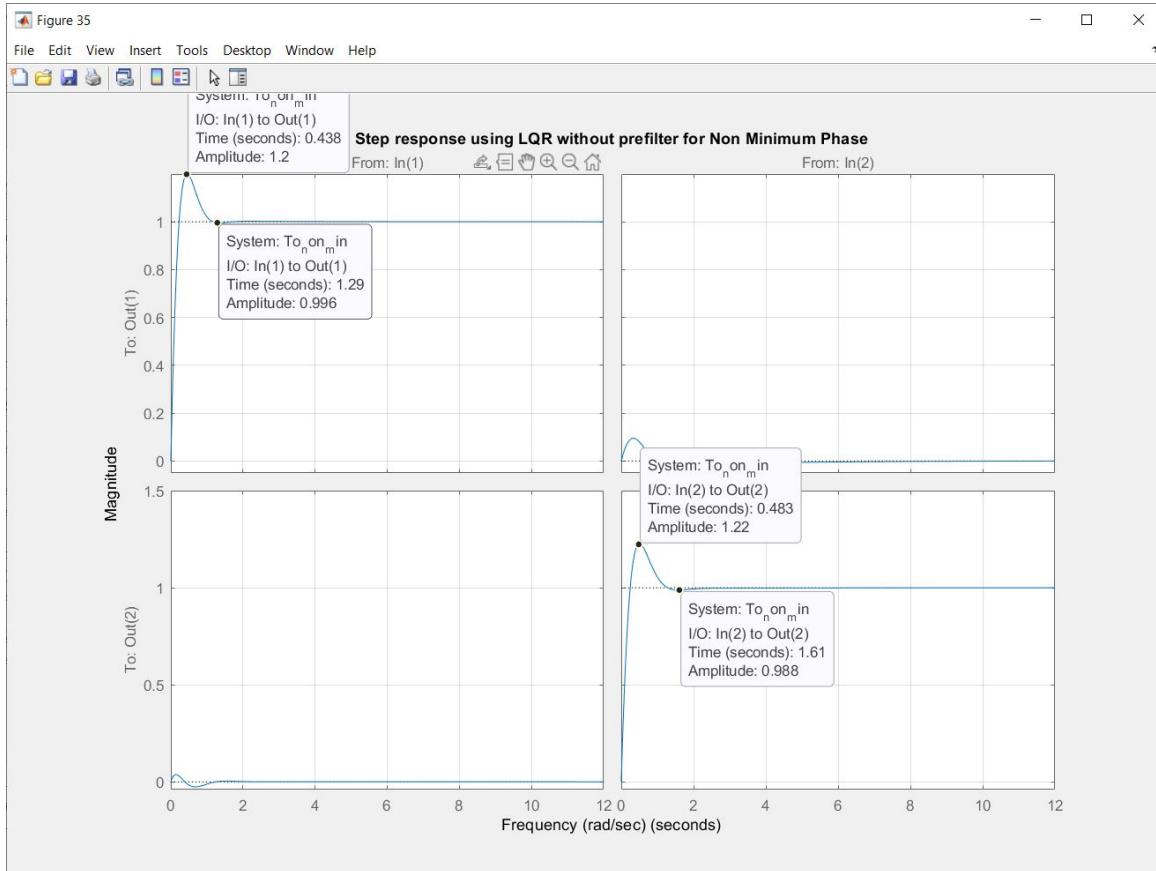


Figure 27: Step Response of LQR for Non- Minimum Phase

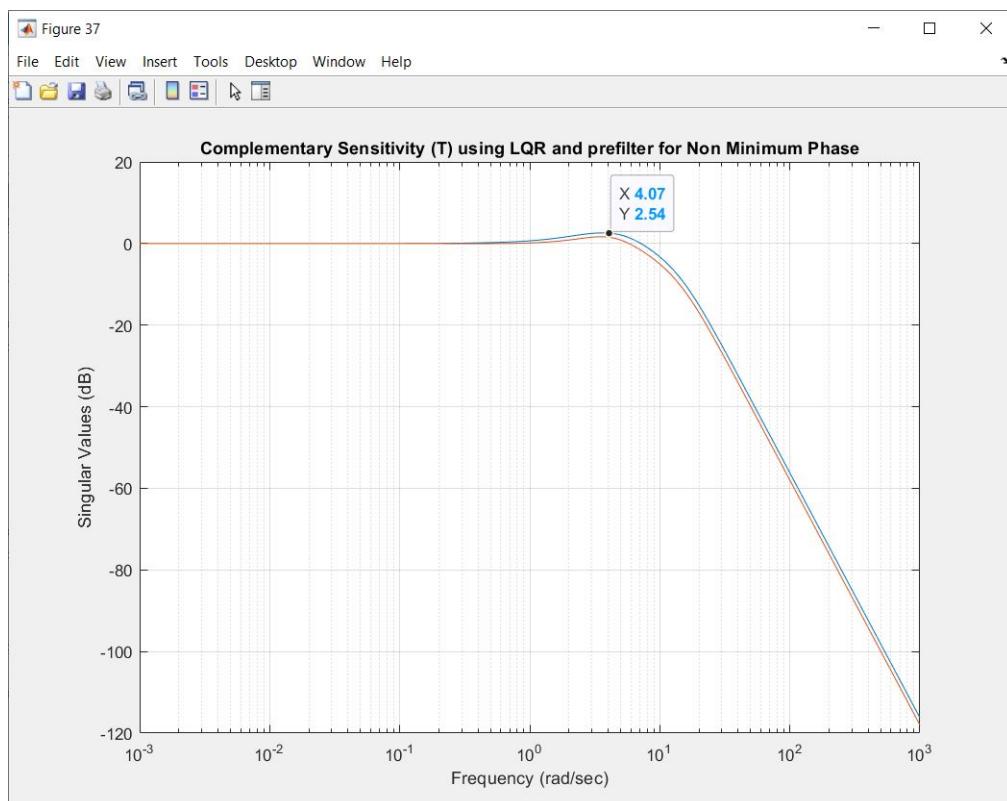


Figure 28: Closed Loop Complementary Sensitivity using LQR with Prefilter for Non-Minimum phase

## 7.2 Kalman-Bucy Filter

The Kalman-Bucy filter is analogous or dual to the LQR(Linear Quadratic Regulator). KBF Problem Statement([12]pp.161-163):

$$\min_{\hat{x}(u,y)} J(\hat{x}) \stackrel{\text{def}}{=} \lim_{t_\alpha \rightarrow -\infty} \sqrt{E(\tilde{x}\tilde{x})} \quad (23)$$

which is subject to the general state space representation with initial condition  $x(0) = x_0$ , and the assumption that  $(A,L)$  is stabilizable and  $(A,M)$  detectable . Solution: The solution to this problem is provided by the following model based state estimation/observer structure:

$$\dot{x} = Ax + Bu + Lm_\xi + H(y - \hat{y}) \quad \hat{x}(t_o) = m_o \quad (24)$$

$$\dot{y} = C\hat{x} + Du + m_\theta \quad (25)$$

where  $\hat{x}$  is the optimal estimate of the state  $x$ ;

- $\hat{y}$  is an estimate of the (known) output  $y$ ;
- $m_o$  is the mean of the initial condition  $x_o$ ; it represents our best a priori estimate for  $x_o$
- $m_\epsilon$  is the mean of the process noise  $\xi$ ; it represents our best a priori estimate for  $\xi$
- $m_\theta$  is the mean of the measurement noise  $\theta$ ; it represents our best a priori estimate for  $\theta$ ;
- the term  $H(y - \hat{y})$  provides a feedback mechanism which will keep  $\dot{x}$  close to  $x$ .
- The matrix  $H$  in  $R^{n \times p}$  is called the filter gain matrix. It is analogous to the control gain matrix  $G$  in the *LQR* problem where the filter gain matrix  $H$  in  $R^{n \times p}$  is given by

$$H = \Sigma C^T \Theta^{-1} \quad (26)$$

and  $\Sigma$  is the unique symmetric (at least) positive semidefinite solution of the following Filter Algebraic Riccati Equation (FARE):

$$0 = A\Sigma + \Sigma A^T + LL^T - \Sigma C^T \Theta^{-1} C \Sigma \quad (27)$$

### 7.2.1 Minimum Phase Characteristics

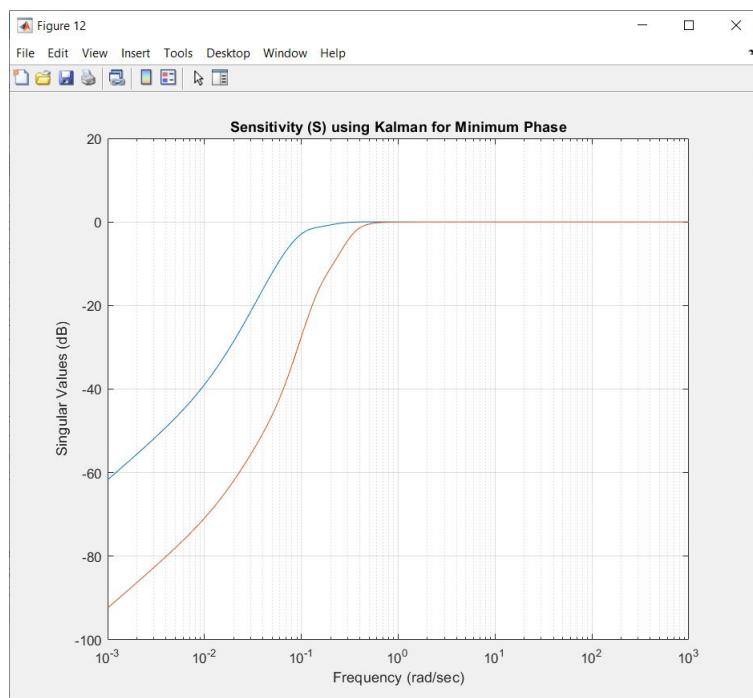


Figure 29: Closed Loop Sensitivity using Kalman for Minimum phase

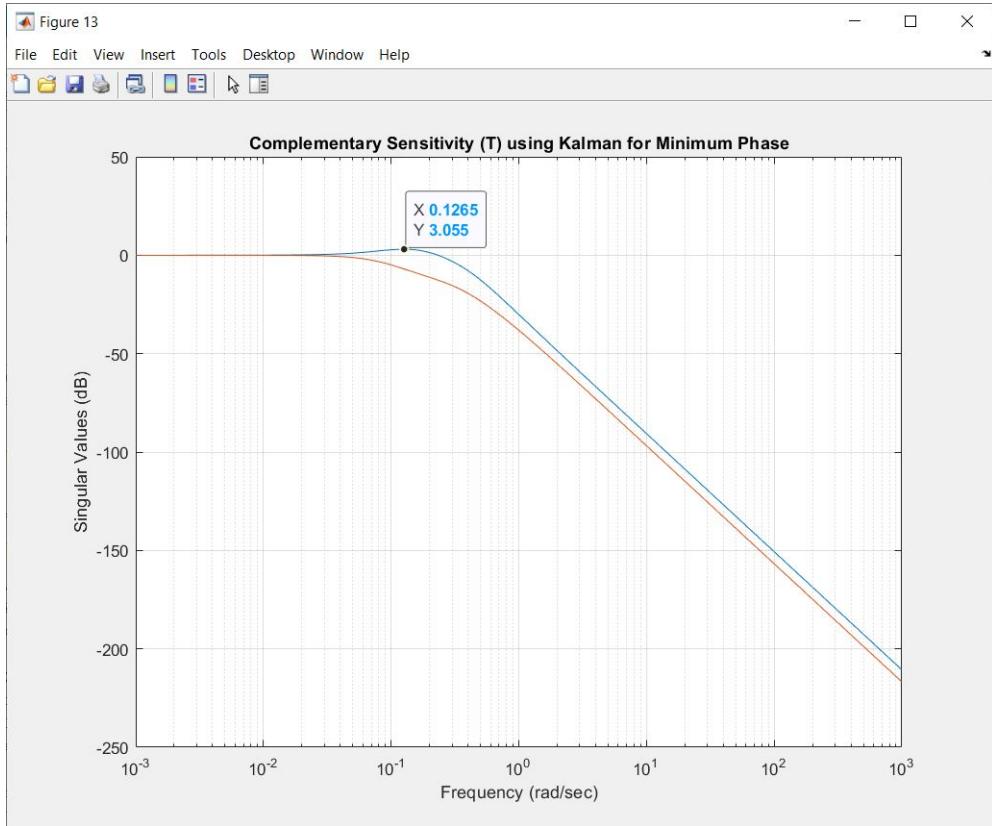


Figure 30: Closed Loop Complementary Sensitivity using Kalman for Minimum phase

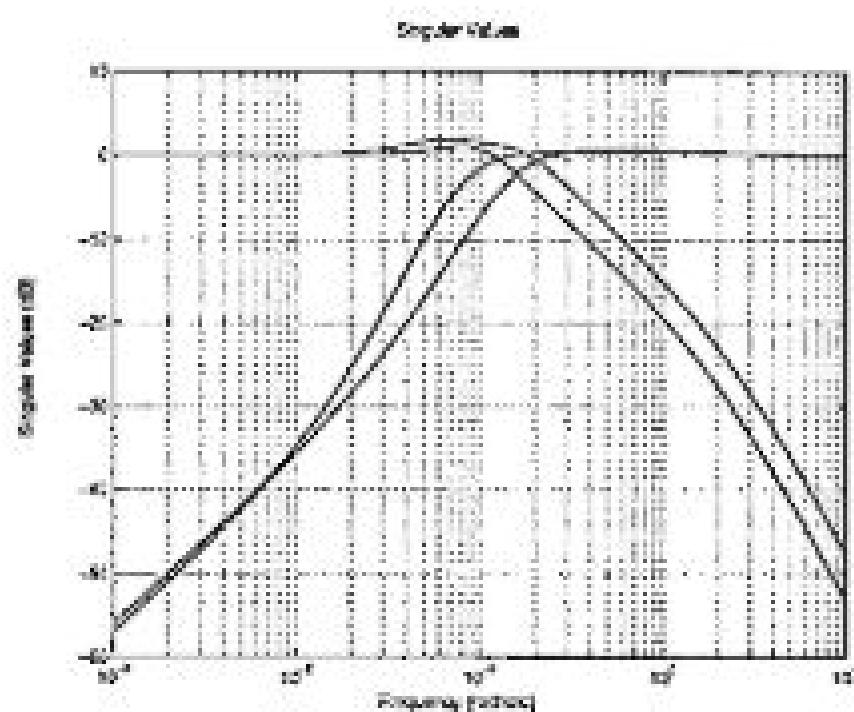


Figure 31: Kalman Filter Sensitivity and Complementary Sensitivity for Minimum Phase from Reference [7]

## 7.2.2 Non-Minimum Phase Characteristics

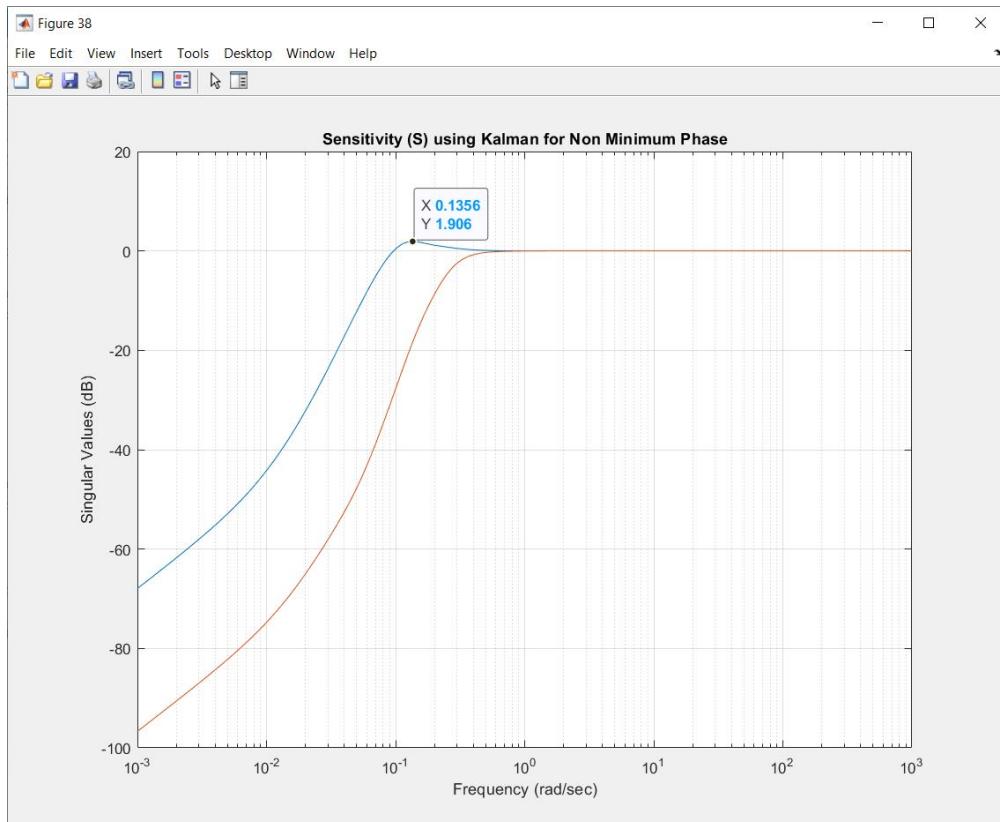


Figure 32: Closed Loop Sensitivity using Kalman for Non-Minimum phase

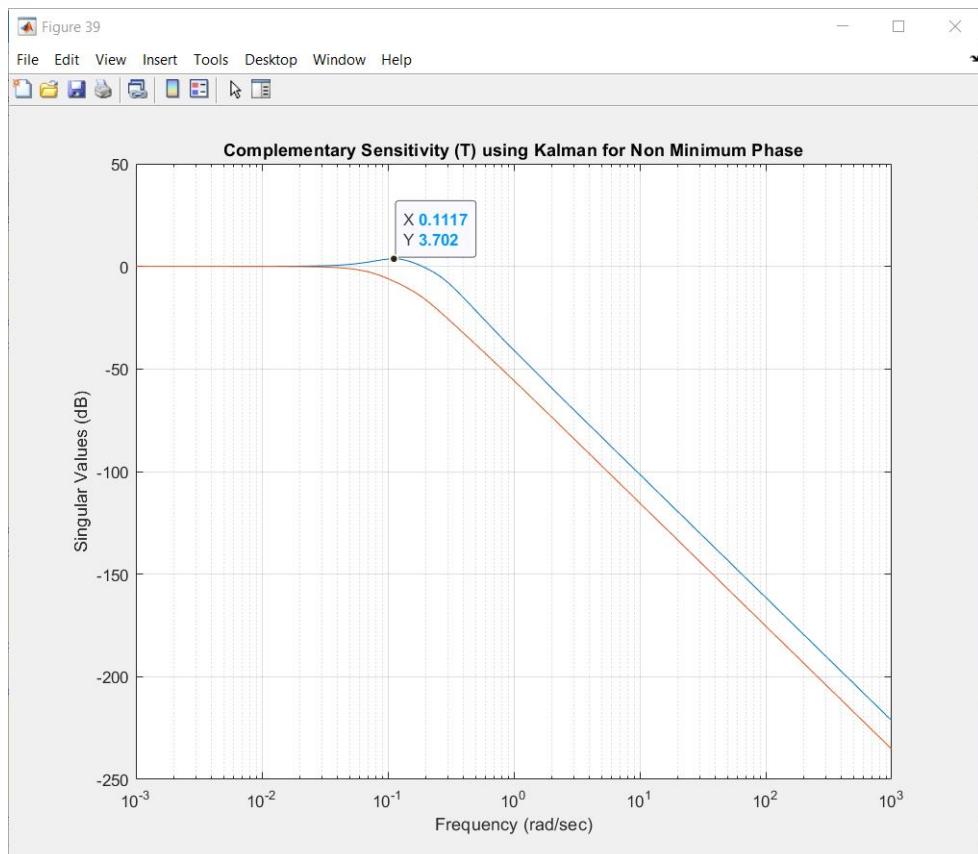


Figure 33: Closed Loop Complementary Sensitivity using Kalman for Non-Minimum phase

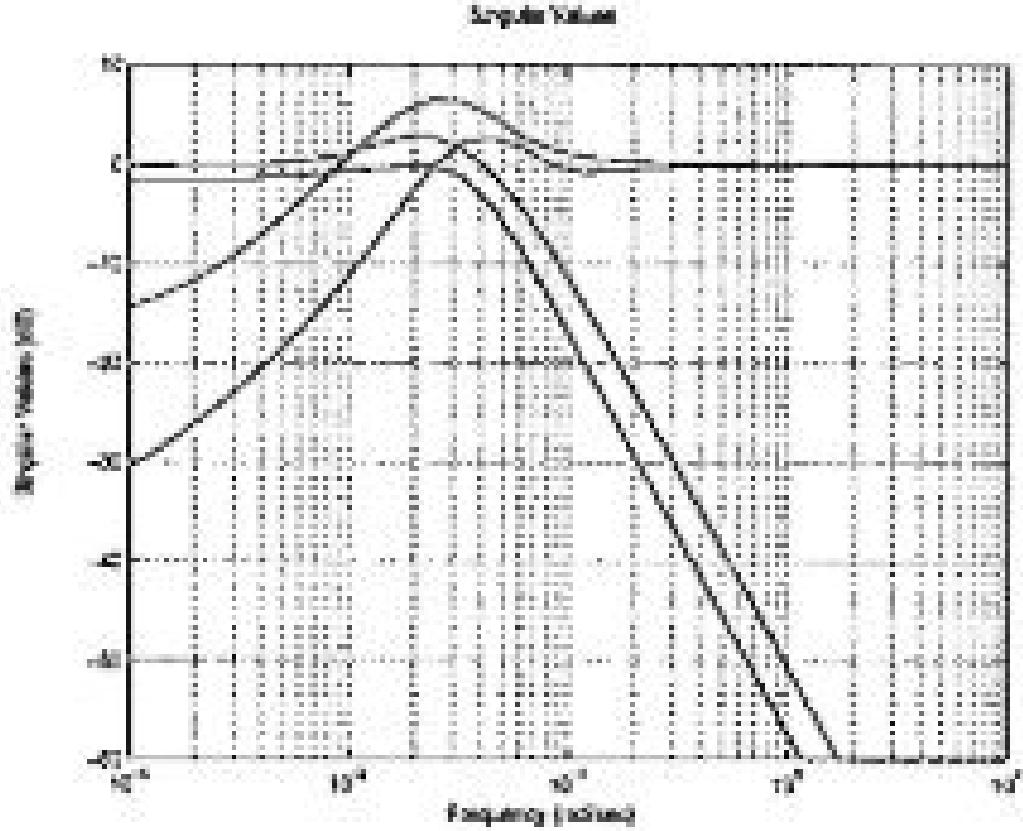


Figure 34: Kalman Filter Sensitivity and Complementary Sensitivity for Non-Minimum Phase from Reference [7]

### 7.3 LQG(Linear Quadratic Gaussian) Controller

The LQG(Linear Quadratic Gaussian) design methodology is a combination of the LQR(Linear Quadratic Regulator) and the Kalman-Bucy Filter[12].

Problem Statement([12]pp.183): The goal of the LQG problem is to minimize the following stochastic quadratic cost functional

$$J(u, y) = E \left[ \int_0^\infty (x^T M^T M x + u^T R u) dt \right] \quad (28)$$

subject to the following dynamic constraint:

$$\begin{aligned} \dot{x} &= Ax + Bu + L\xi & x(0) &= x_o \\ y &= Cx + \theta \end{aligned} \quad (29)$$

over all linear functionals of  $u$  and  $y$ . The assumptions includes  $(A, B, M)$  is stabilizable and detectable. Solution:

Optimal Compensator Structure: The optimal LQG controller (compensator) is a dynamic system and may be written as follows:

$$\begin{aligned} \dot{x} &= (A - BG - HC)\hat{x} + Lm_\xi + H(y - m_0) \\ \hat{u} &= -G\hat{x} \end{aligned} \quad (30)$$

Closed Loop Properties: The resulting closed loop dynamical system enjoys a separation principle with all closed loop poles - eigenvalues of  $A - BG$  and  $A - HC$  - in the open left half plane. When  $x_o$ ,  $\xi$ , and  $\theta$  are Gaussian, the above control law is the optimal control law (without further qualification)([12]pp.183-184).

### 7.3.1 Minimum Phase Characteristics

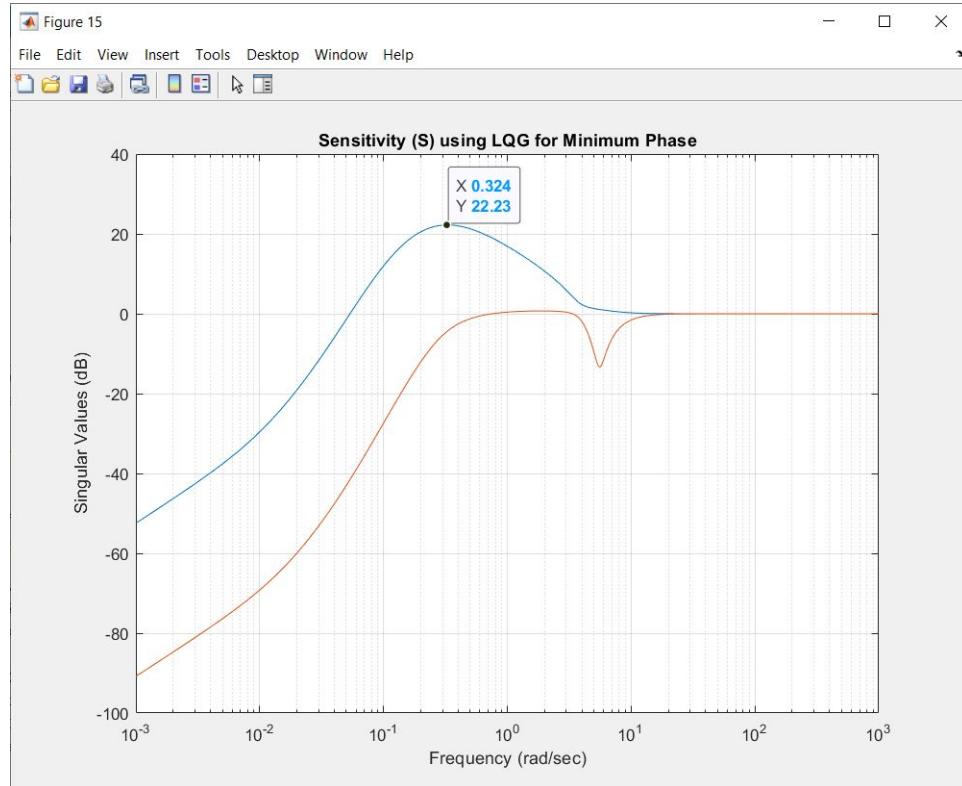


Figure 35: Closed Loop Sensitivity using LQG for Minimum phase

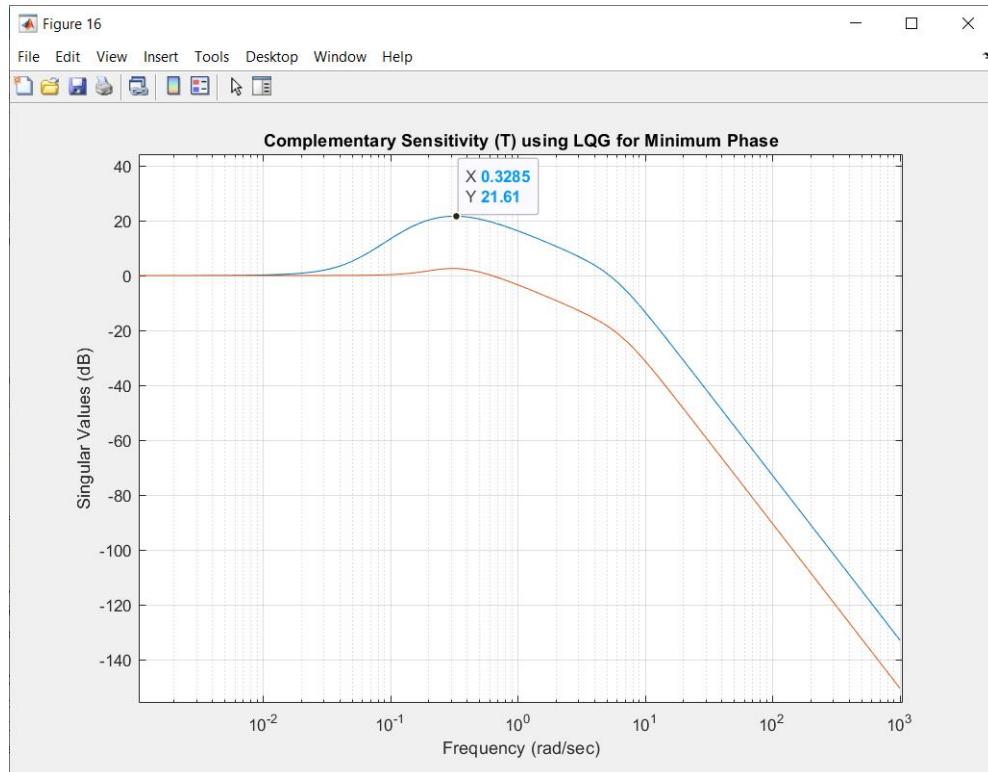


Figure 36: Closed Loop Complementary Sensitivity using LQG for Minimum phase

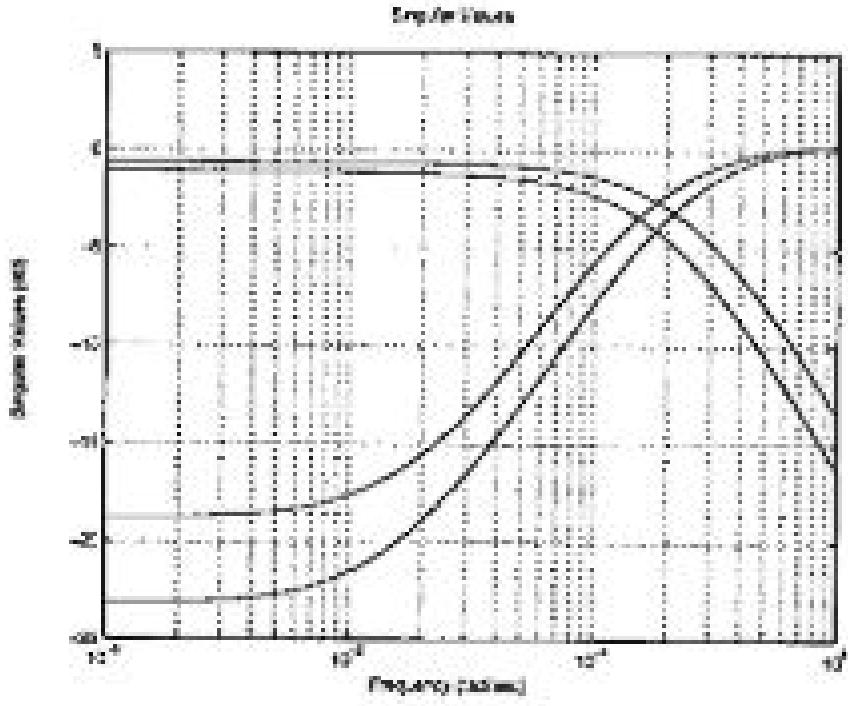


Figure 37: Sensitivity and Complementary Sensitivity using LQG for Minimum Phase from Reference

[7]

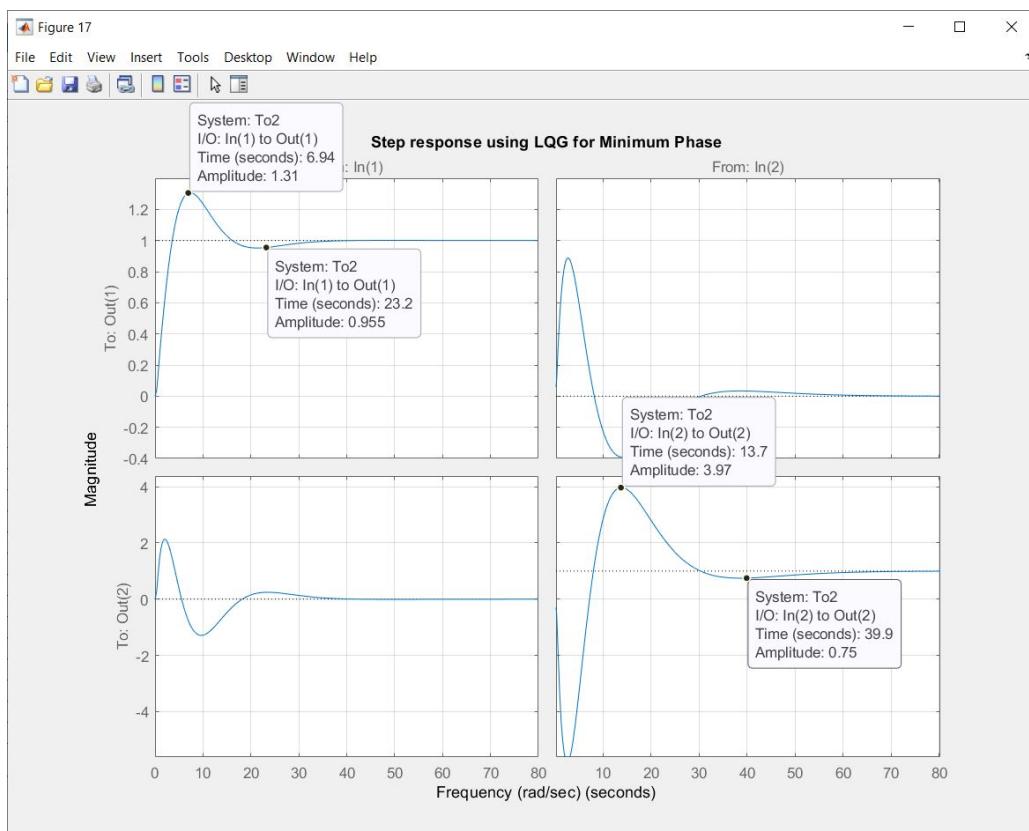


Figure 38: Step Response of LQG for Minimum Phase

### 7.3.2 Non-Minimum Phase Characteristics

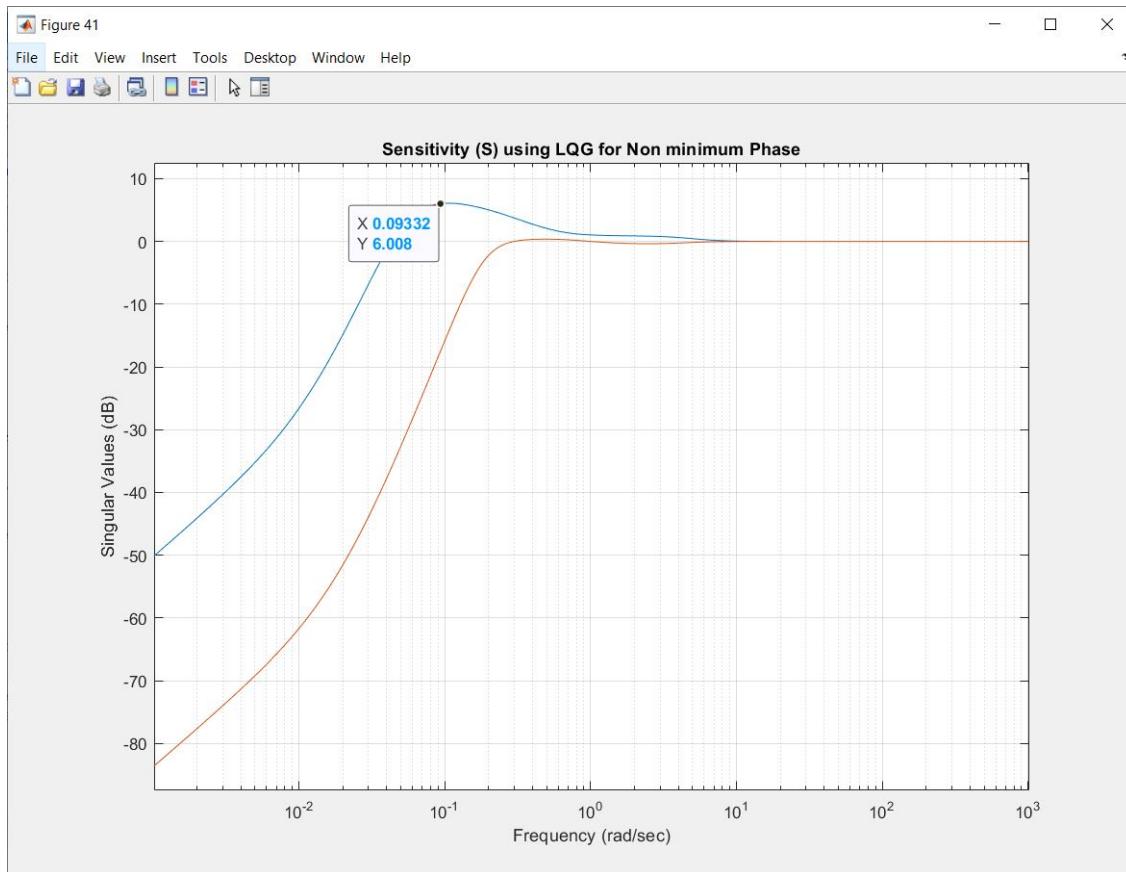


Figure 39: Closed Loop Sensitivity using LQG for Non-Minimum phase

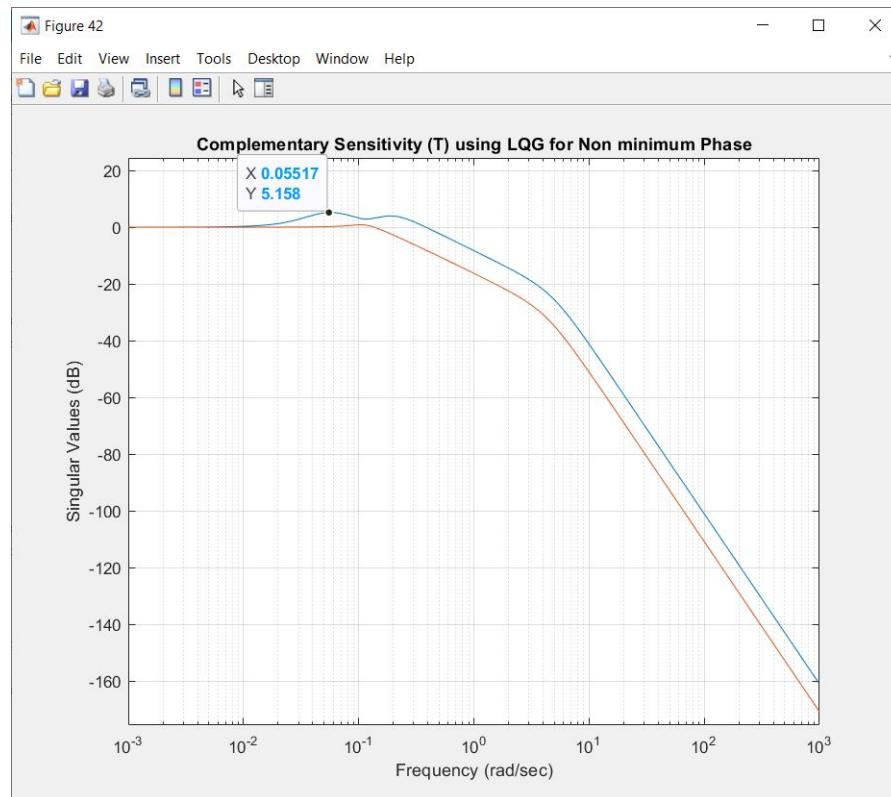


Figure 40: Closed Loop Complementary Sensitivity using LQG for Non-Minimum phase

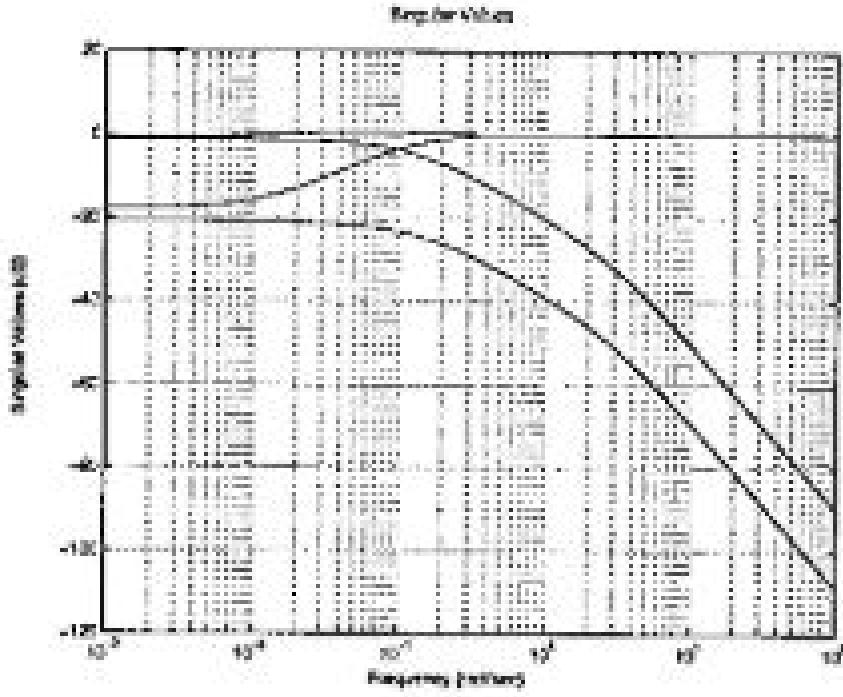


Figure 41: Sensitivity and Complementary Sensitivity using LQG for Non-Minimum Phase from Reference

[7]

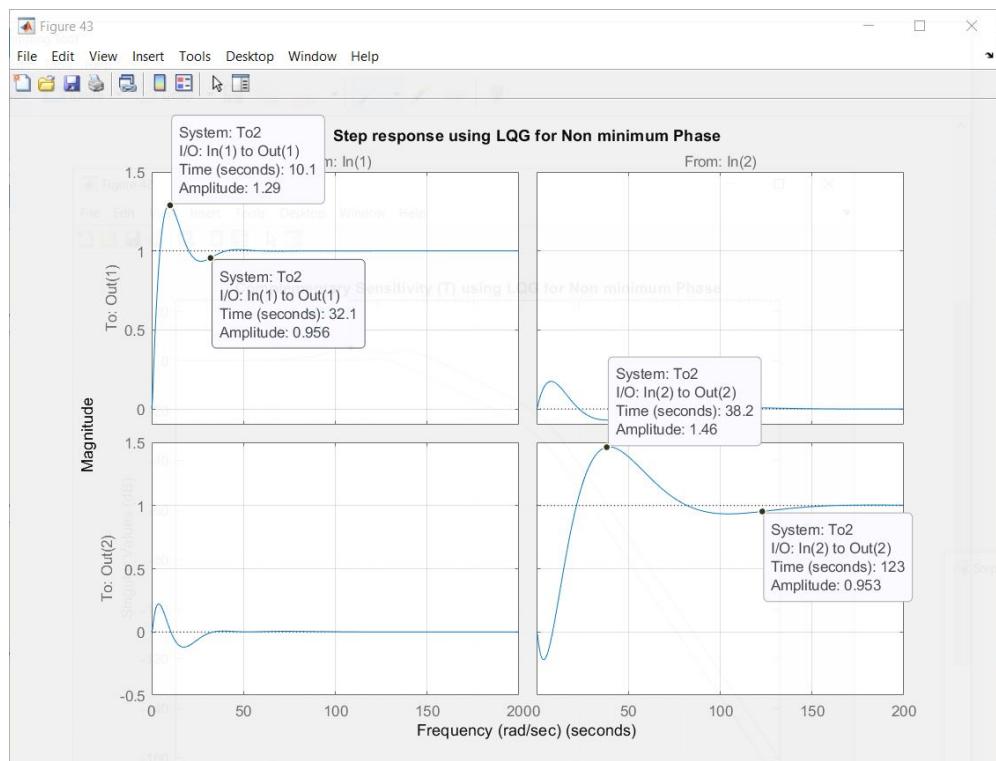


Figure 42: Step Response of LQG for Non- Minimum Phase

## 7.4 H-Infinity Controller

### 7.4.1 Minimum Phase Characteristics

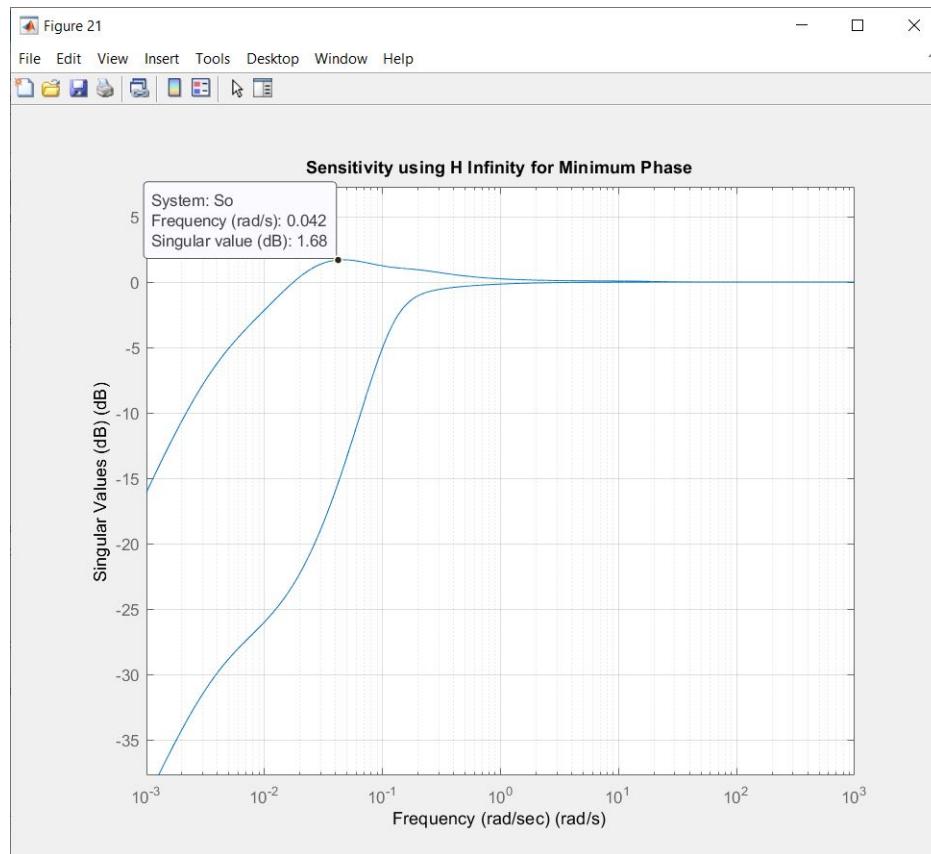


Figure 43: Closed Loop Sensitivity using H-Infinity for Minimum phase

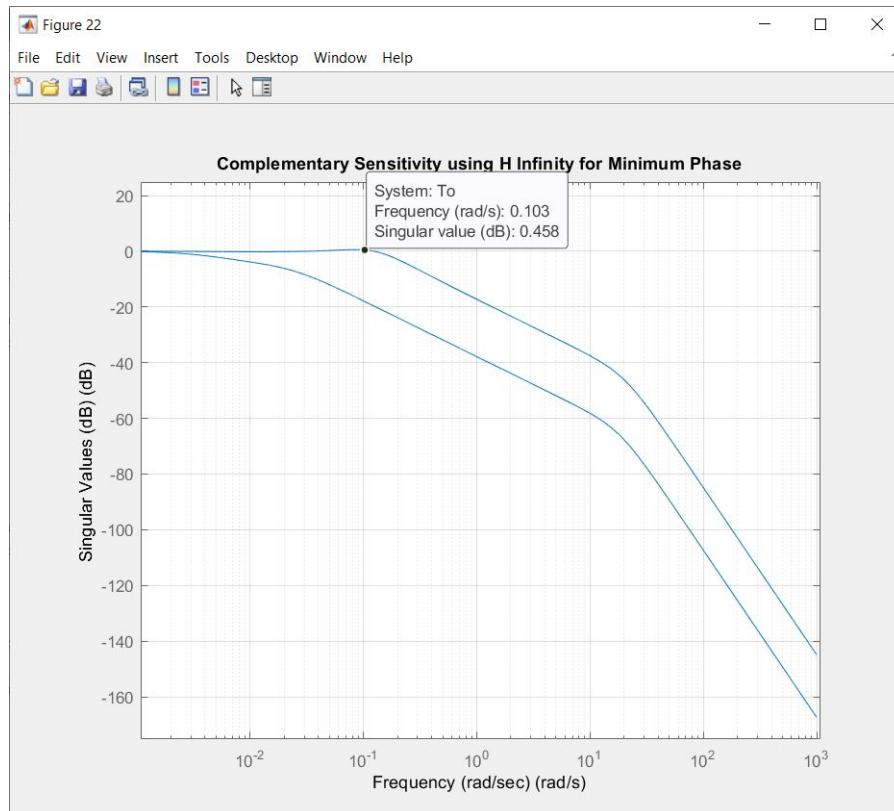


Figure 44: Closed Loop Complementary Sensitivity using H-Infinity for Minimum phase

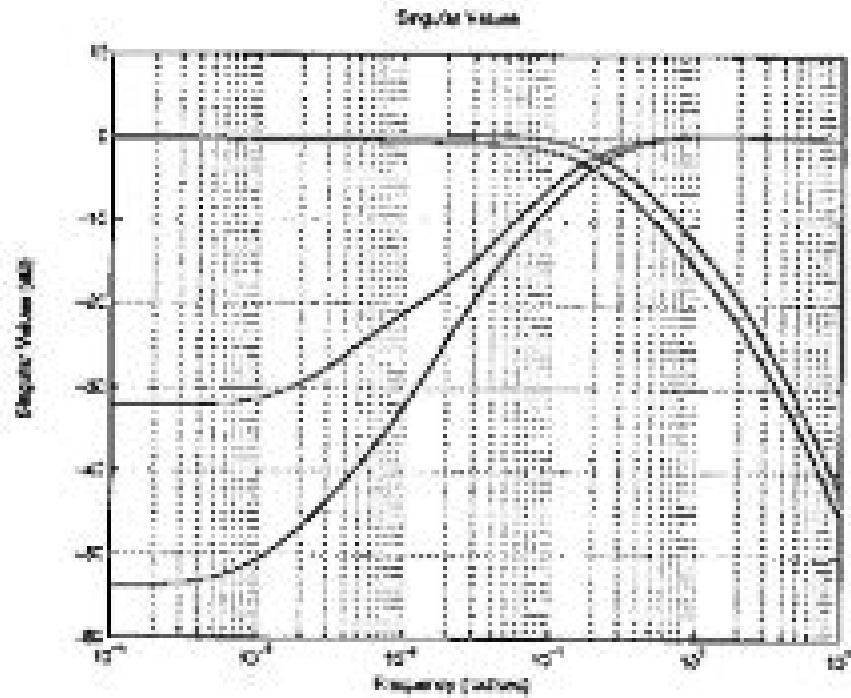


Figure 45: Sensitivity and Complementary Sensitivity using H-Infinity for Minimum Phase from Reference

[7]

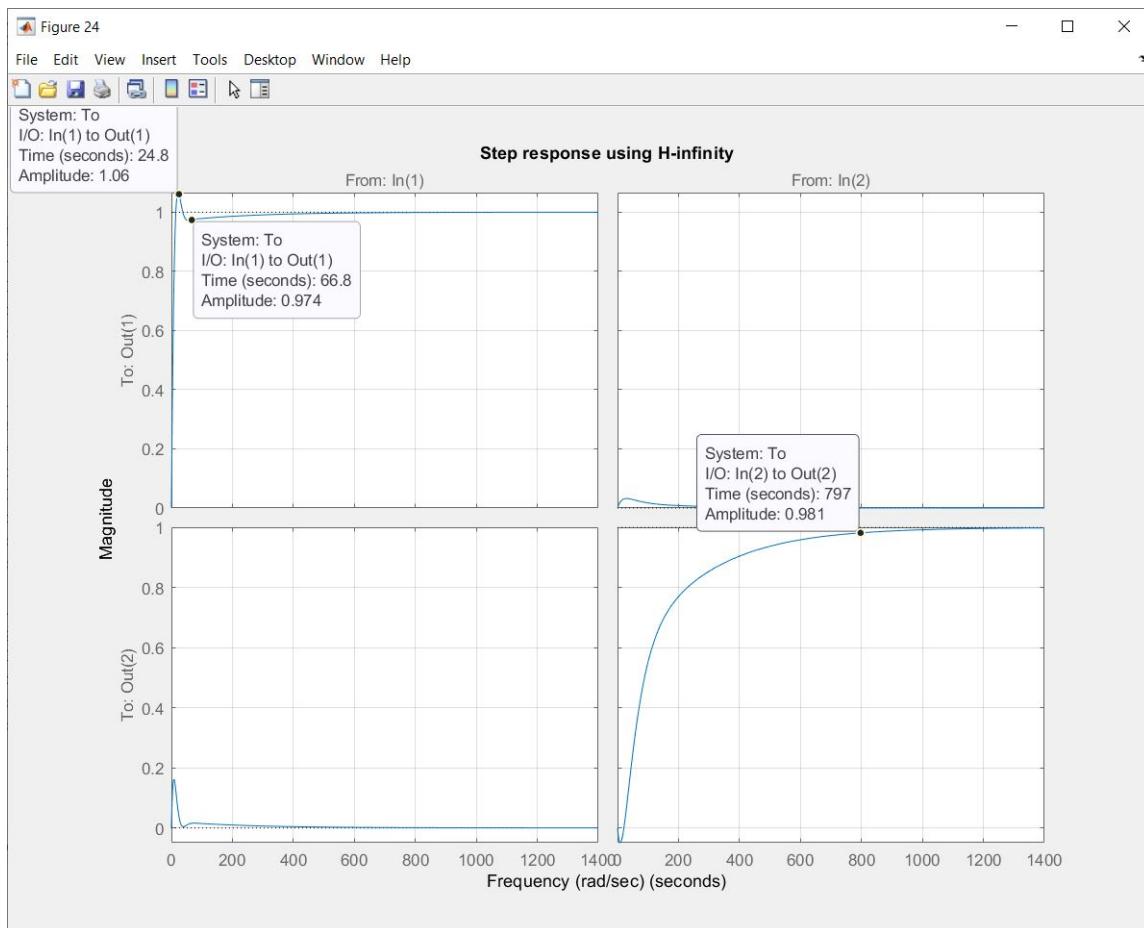


Figure 46: Step Response of H-Inf for Minimum Phase

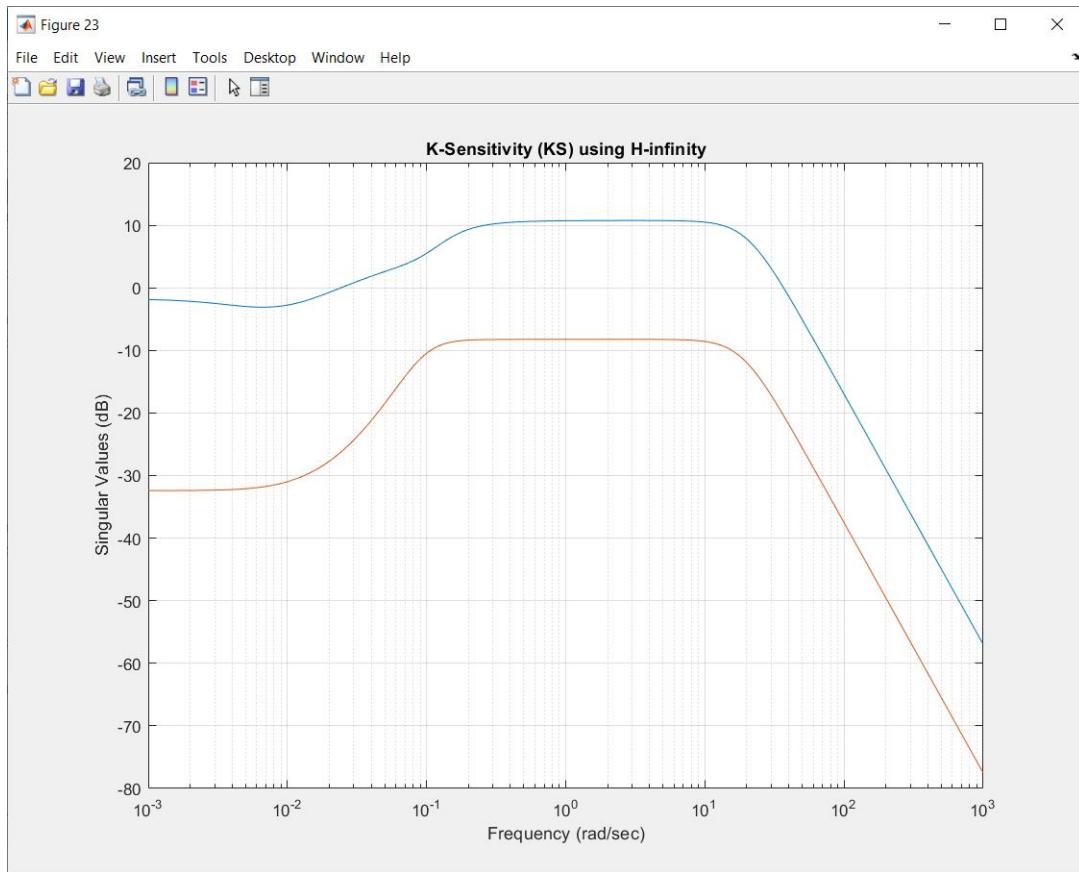


Figure 47: K-Sensitivity frequency response using H-Infinity for Minimum Phase

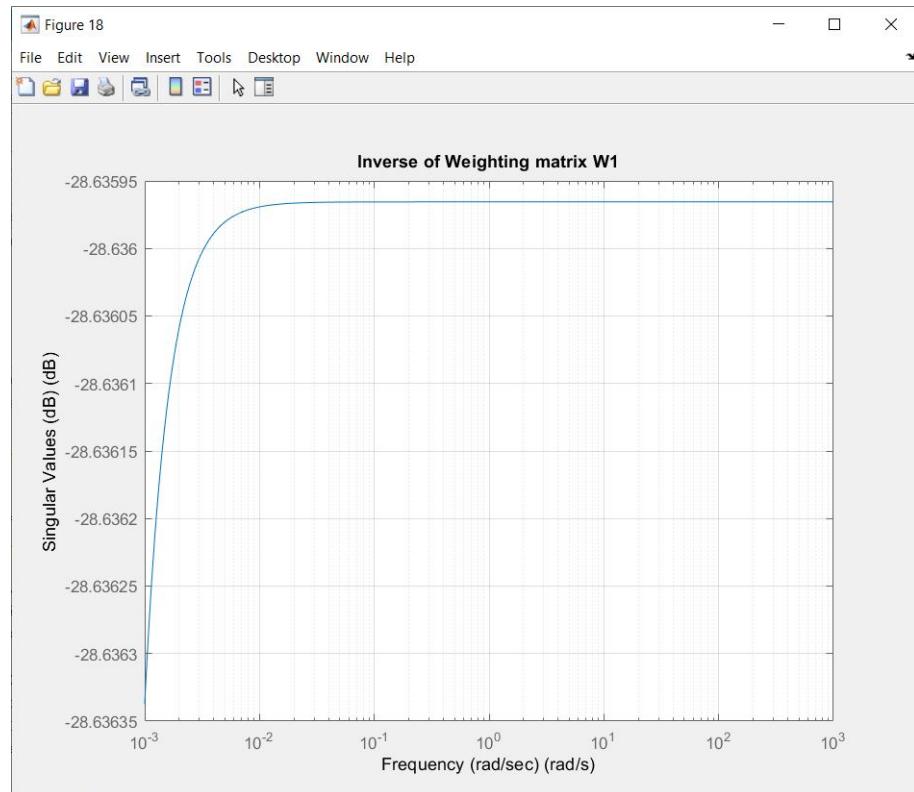


Figure 48: Uncertainty Weighting Function W1 for Minimum phase

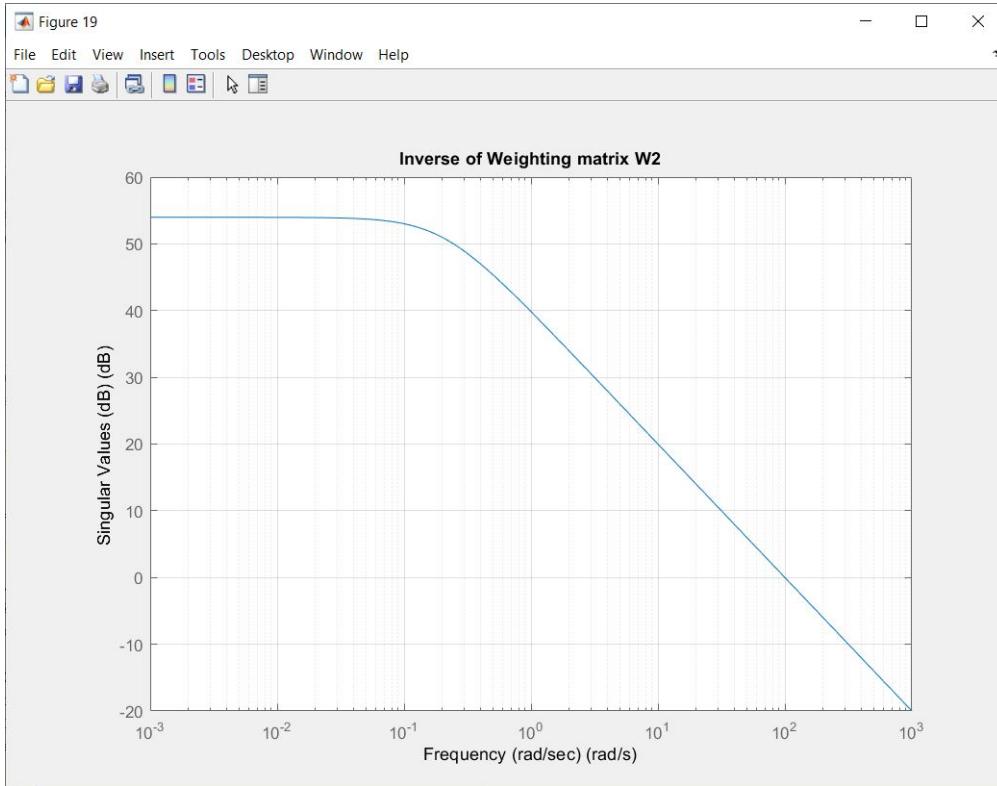


Figure 49: Uncertainty Weighting Function W2 for Minimum phase

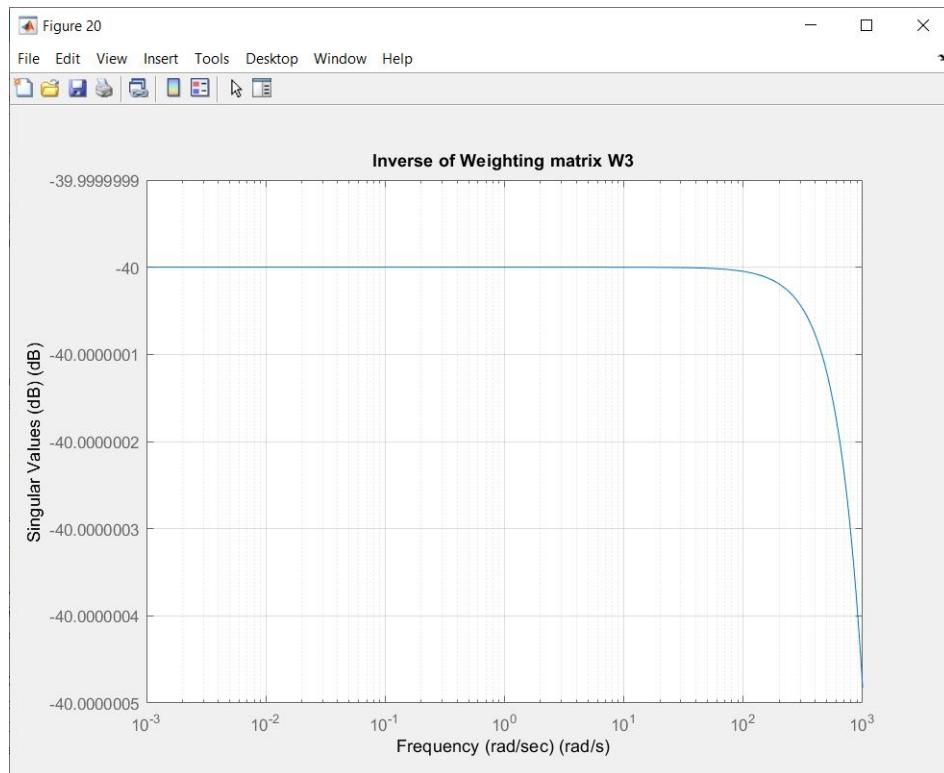


Figure 50: Uncertainty Weighting Function W3 for Minimum phase

#### 7.4.2 Non-Minimum Phase Characteristics

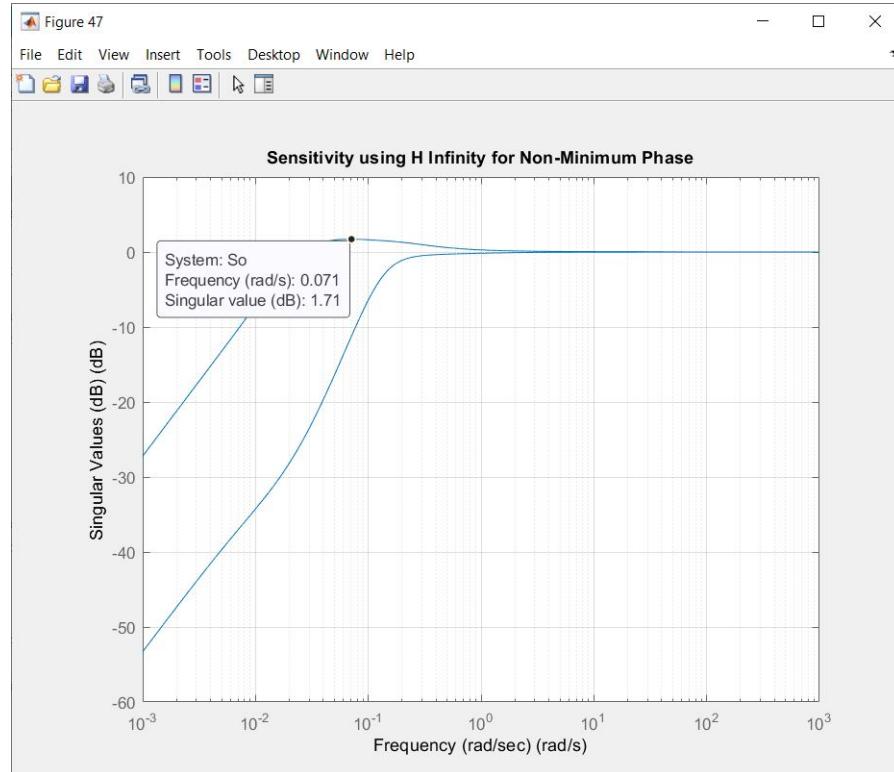


Figure 51: Closed Loop Sensitivity using H-Infinity for Non-Minimum phase

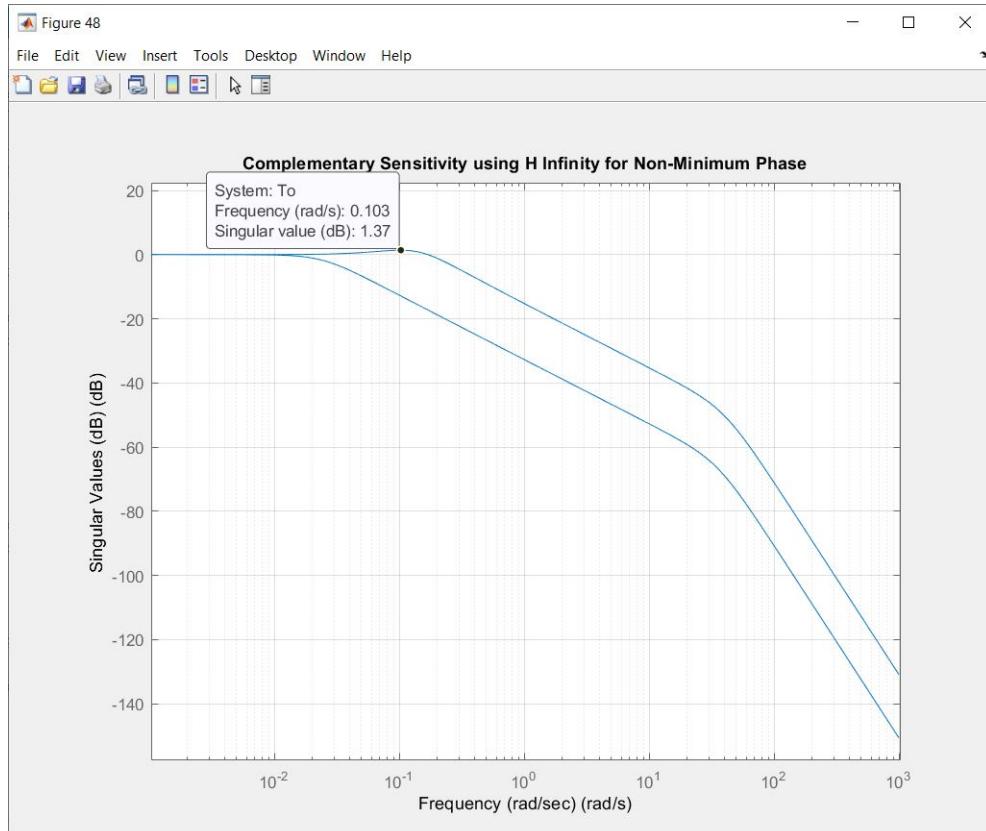


Figure 52: Closed Loop Complementary Sensitivity using H-Infinity for Non-Minimum phase

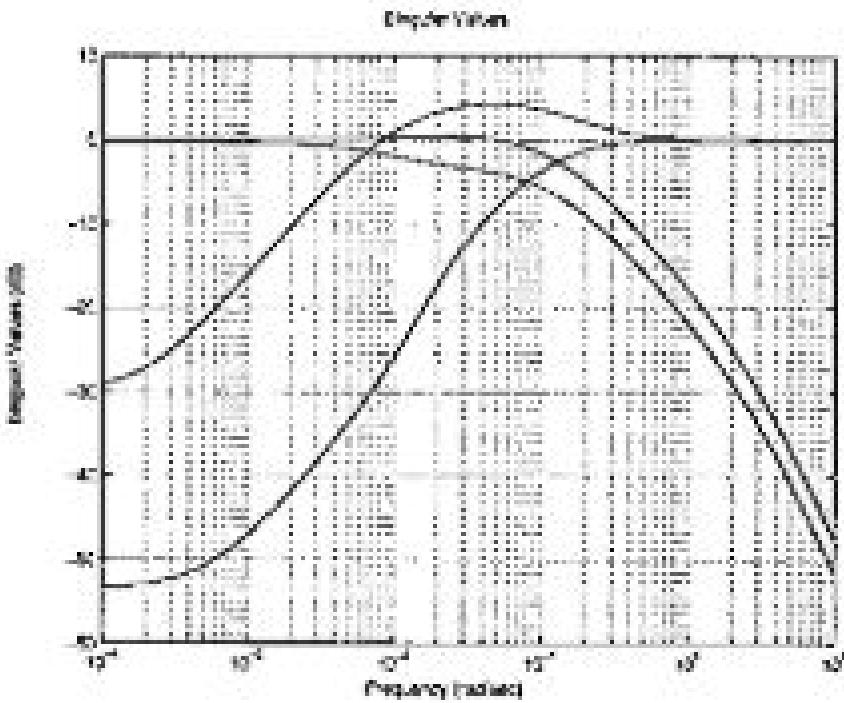


Figure 53: Sensitivity and Complementary Sensitivity using H-Infinity for Non-Minimum Phase from Reference

[7]

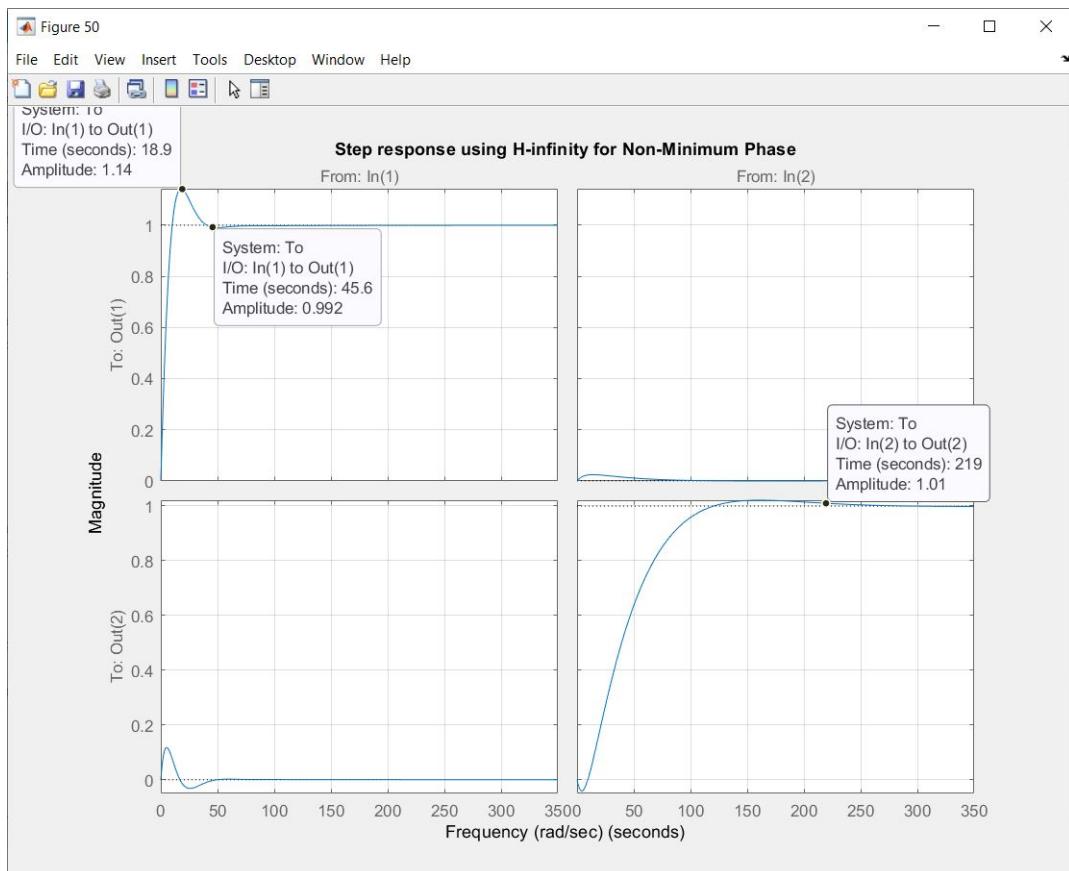


Figure 54: Step Response of H-Infinity for Non- Minimum Phase

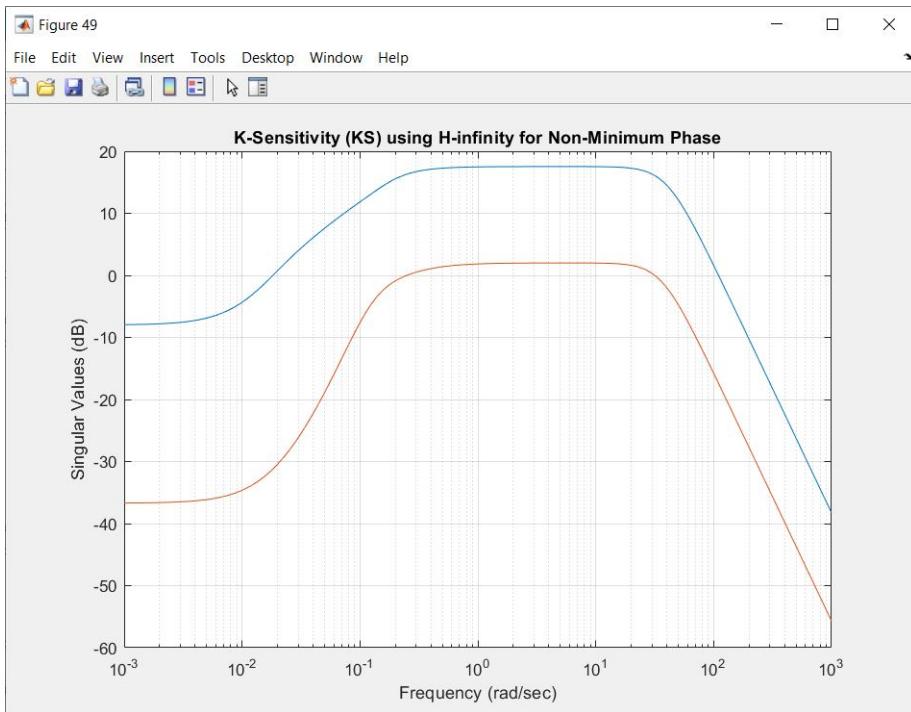


Figure 55: K-Sensitivity frequency response using H-Infinity for Non-Minimum Phase

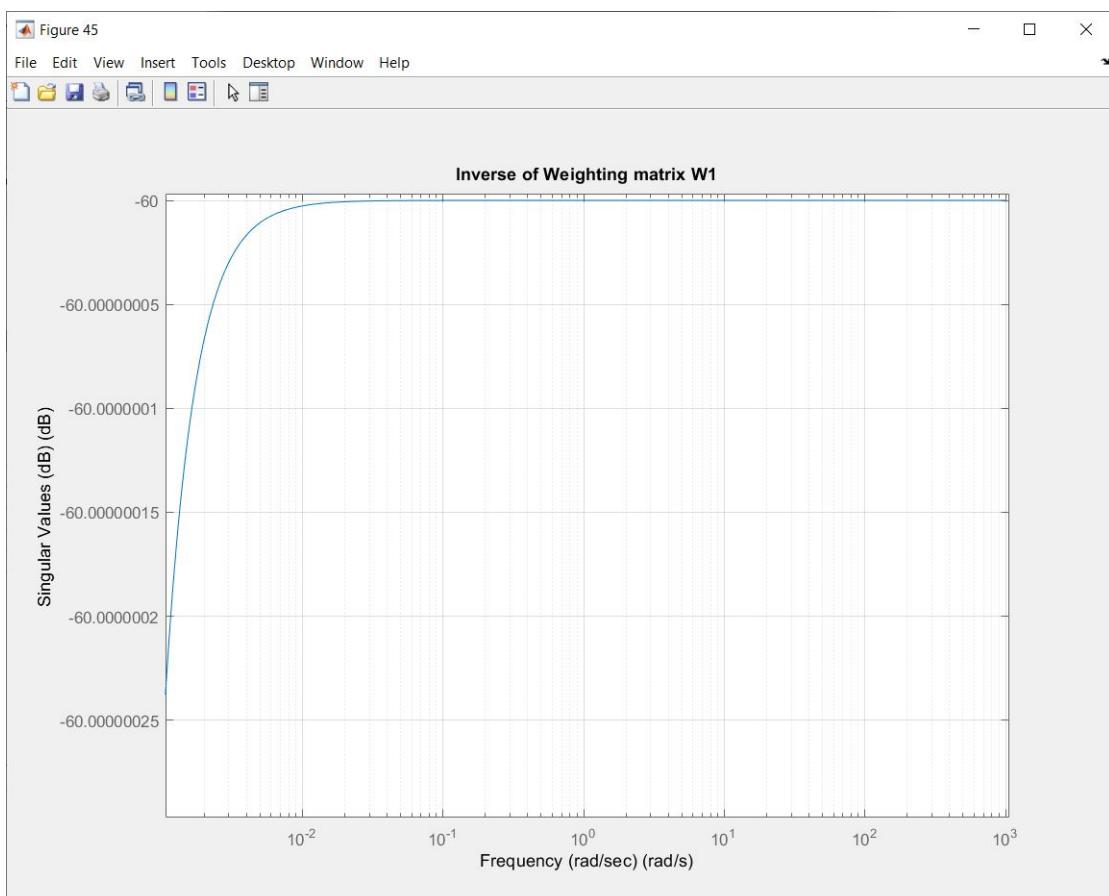


Figure 56: Uncertainty Weighting Function W1 for Non-Minimum phase

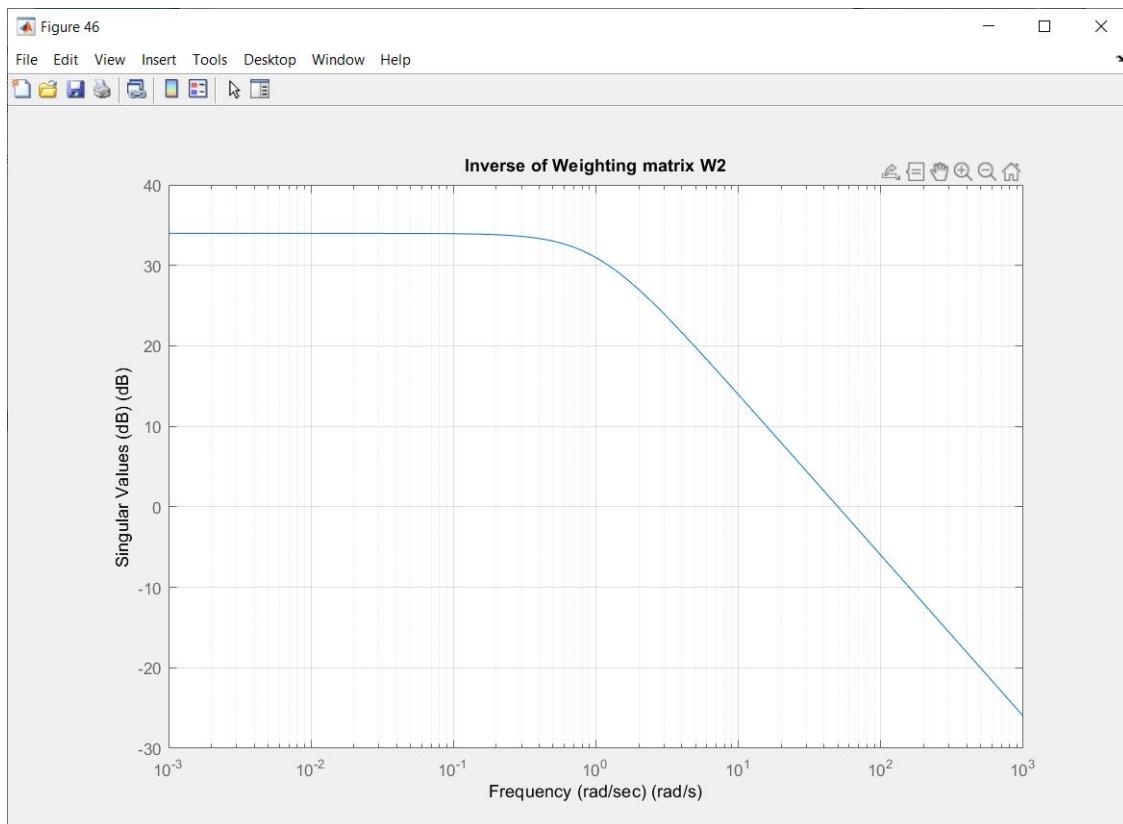


Figure 57: Uncertainty Weighting Function W2 for Non-Minimum phase

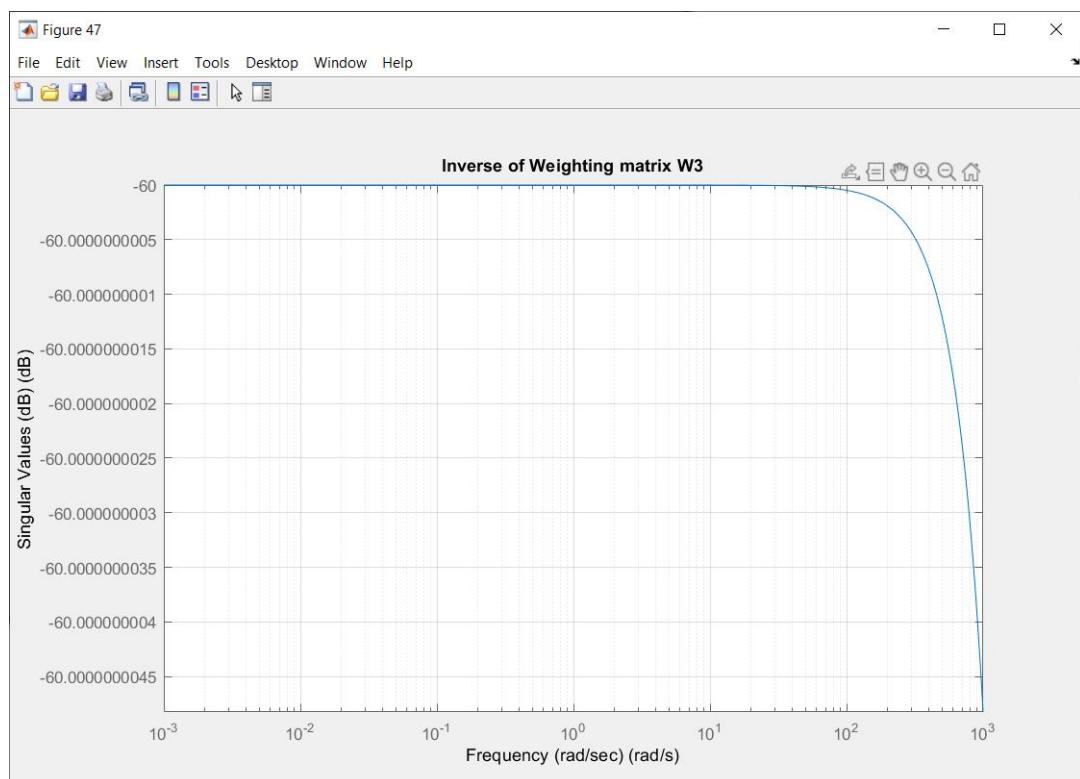


Figure 58: Uncertainty Weighting Function W3 for Non-Minimum phase

## 7.5 Other Controllers from the Literature

### 7.5.1 PI Controller [10][11]

- Dashed line represents PI control with static decoupling and the solid line represents Glover-McFarlane designs.
- The bandwidth for the non minimum-phase case is almost a magnitude lower than for the minimum-phase case. This is due to the performance limitation that the multivariable right half-plane zero imposes[10].

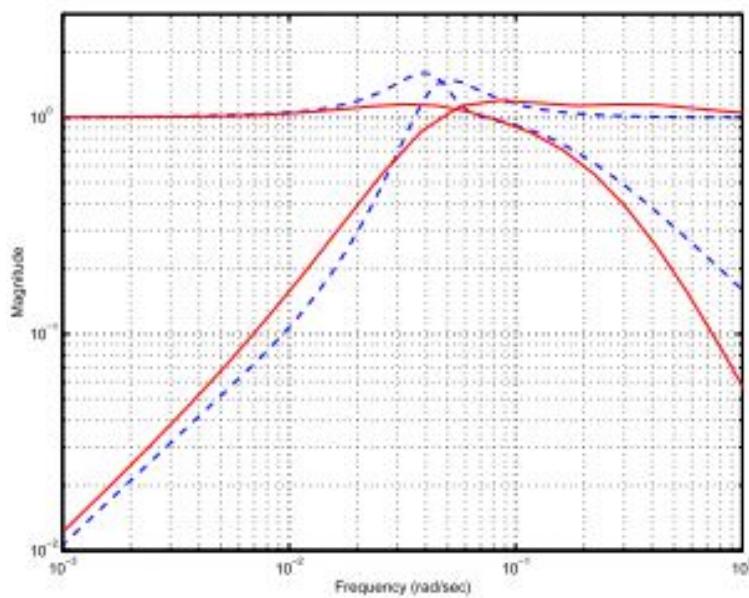


Figure 59: Sensitivity functions and complementary sensitivity functions for the minimum-phase setting

[10]

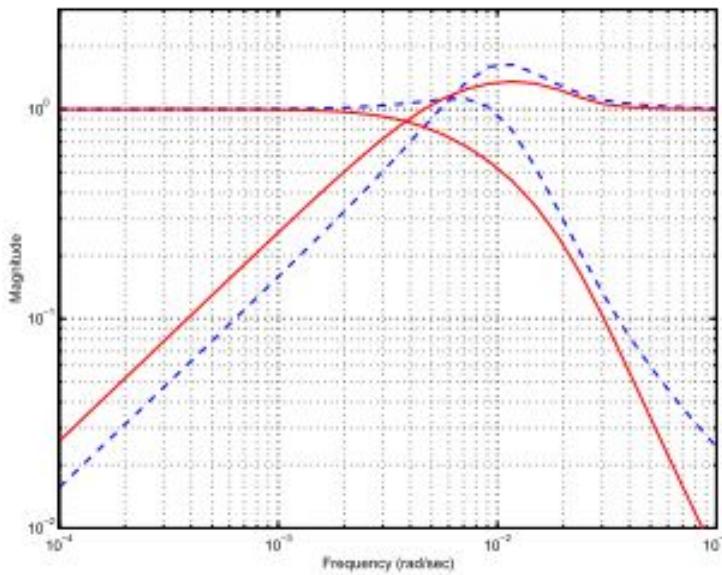


Figure 60: Sensitivity functions and complementary sensitivity functions for the Non-minimum-phase setting

[10]

- The dashed line represents the non-Linear model simulation whereas the solid black line represents the linear model

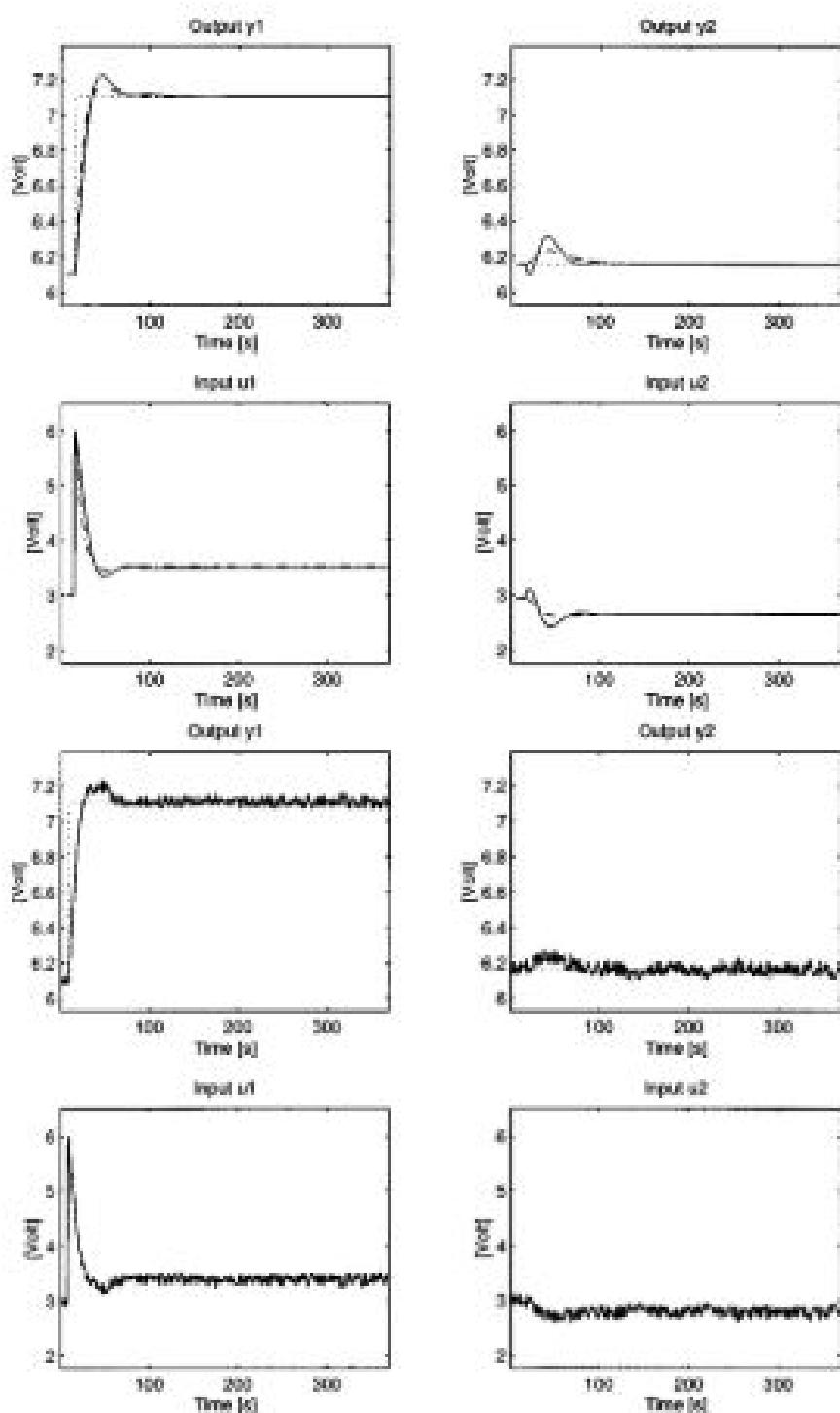


Figure 61: Minimum phase PI Controller  
[11]

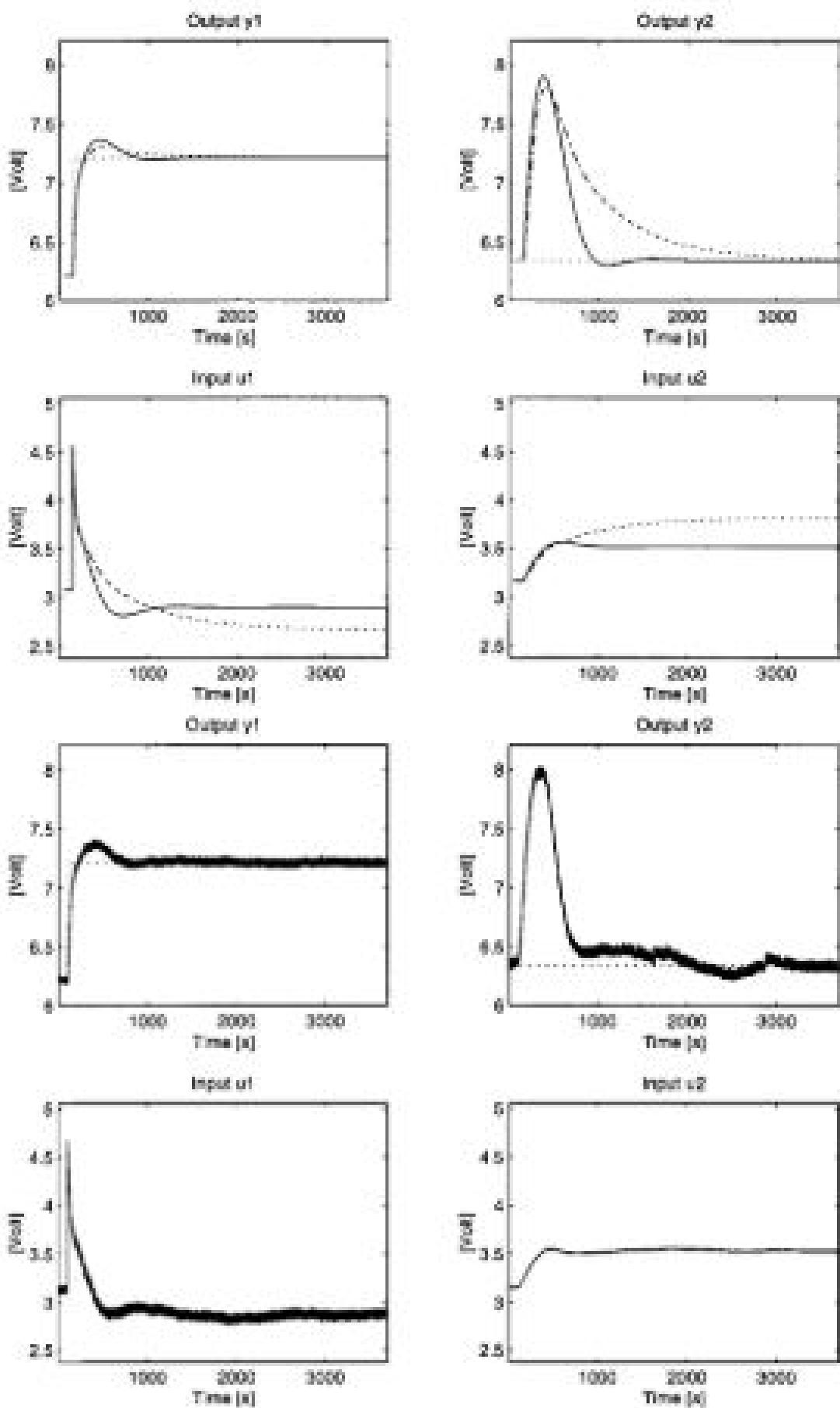


Figure 62: Non-Minimum Phase PI Controller  
[11]

### 7.5.2 Loop-Shaping [7]

- The general idea behind loop shaping is to construct an open loop transfer function L which meets desired performance requirements.
- This simple method works for plants which do not contain a RHP zero, if a plant contains a RHP zero then more advance loop shaping techniques can be used.
- Loop shaping creates a 4<sup>th</sup> order controller.

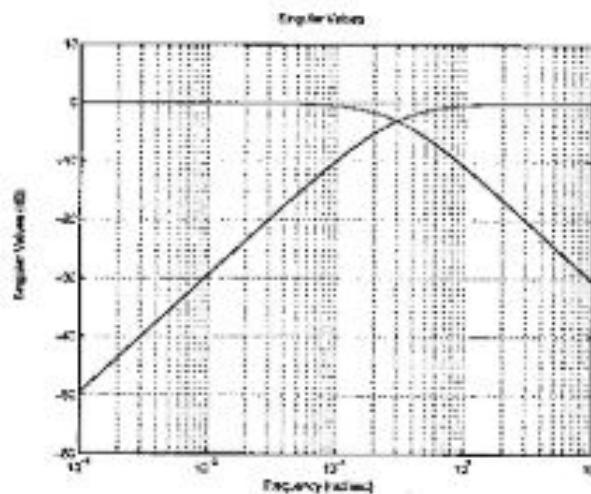


Figure 63: Loop Shaping Sensitivity and Complementary sensitivity  
[7]

## 8 Hardware Results

### 8.1 Simulation Results

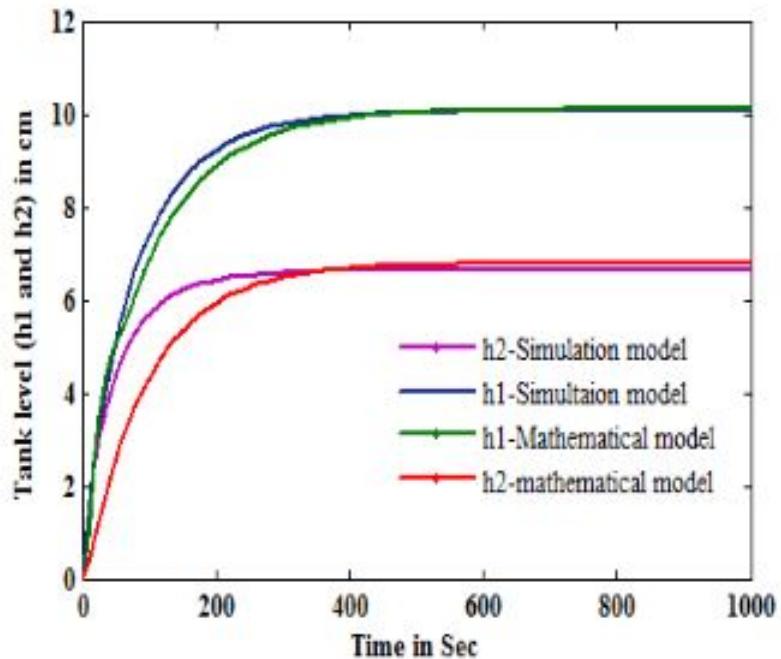


Figure 64: Open Loop Responses in Non-Minimum Phase  
[6]

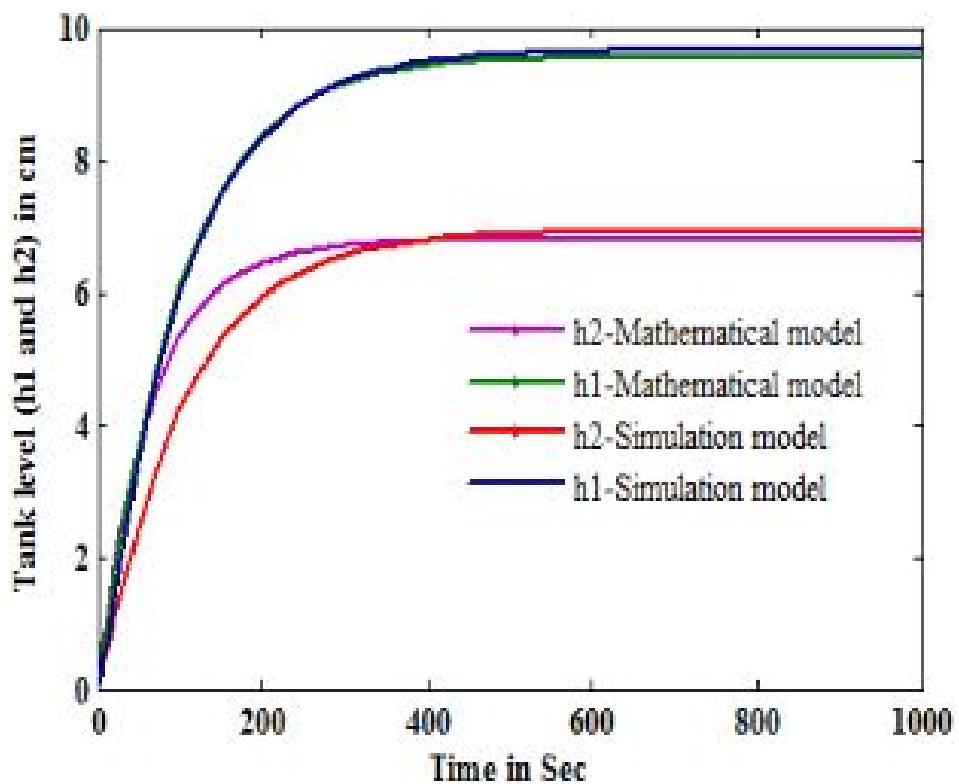


Figure 65: Open Loop Responses in Minimum Phase  
[6]

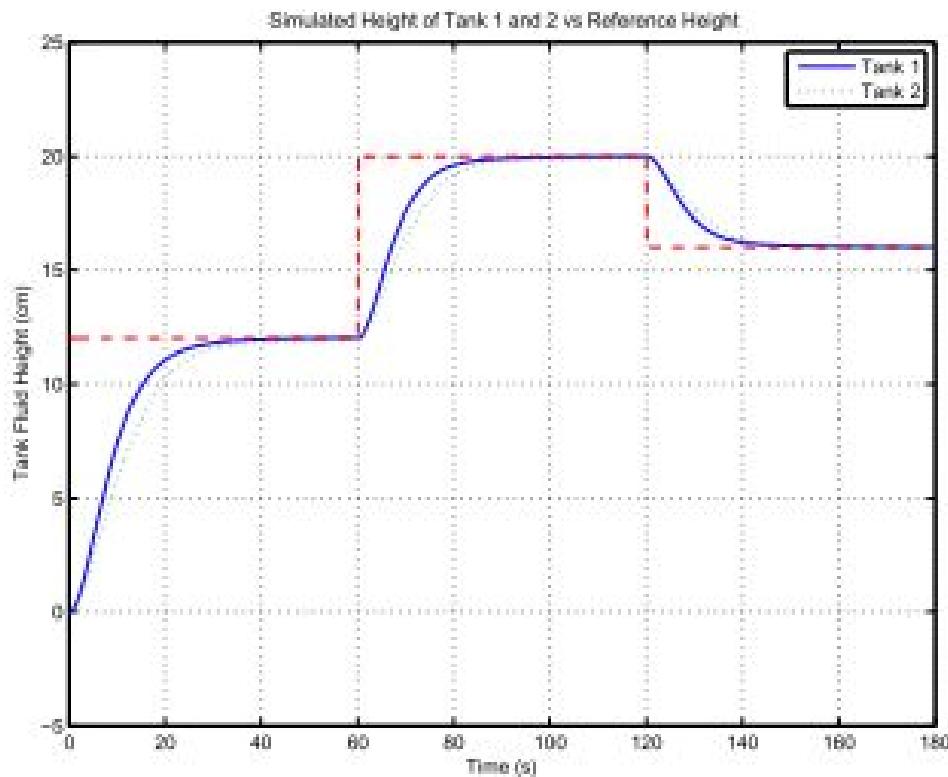


Figure 66: A simulated comparison of commanded reference input to tank fluid height QTP.  
[5]

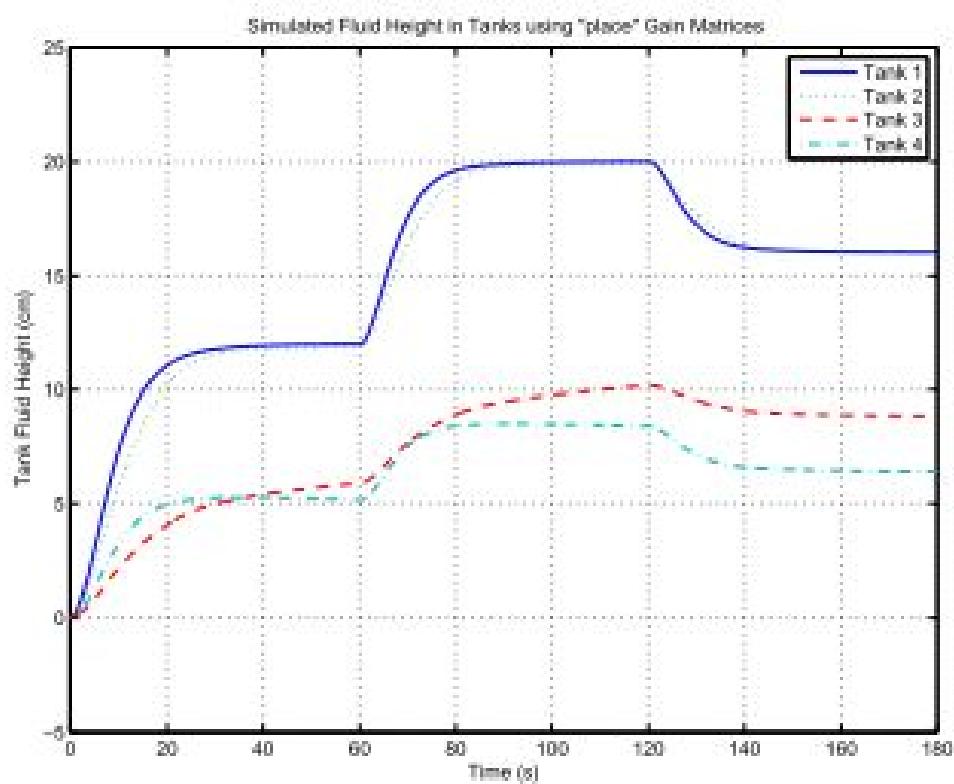


Figure 67: Simulated tank fluid height responses  
[5]

## 8.2 Experimental Results

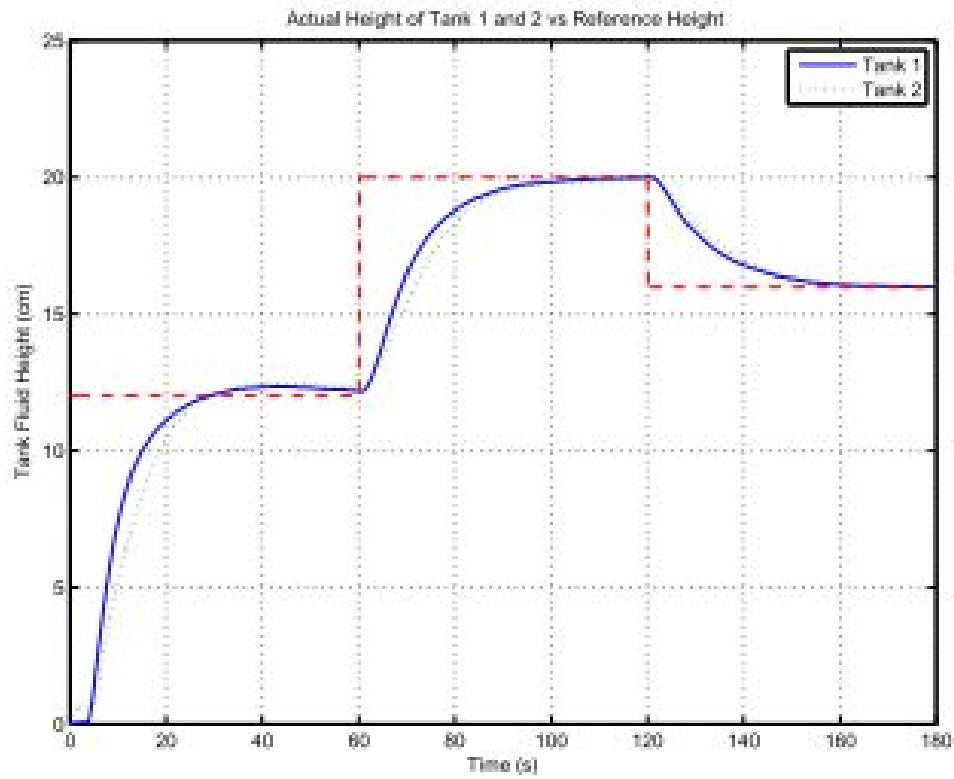


Figure 68: Actual comparison of commanded reference input to tank fluid height.  
[5]

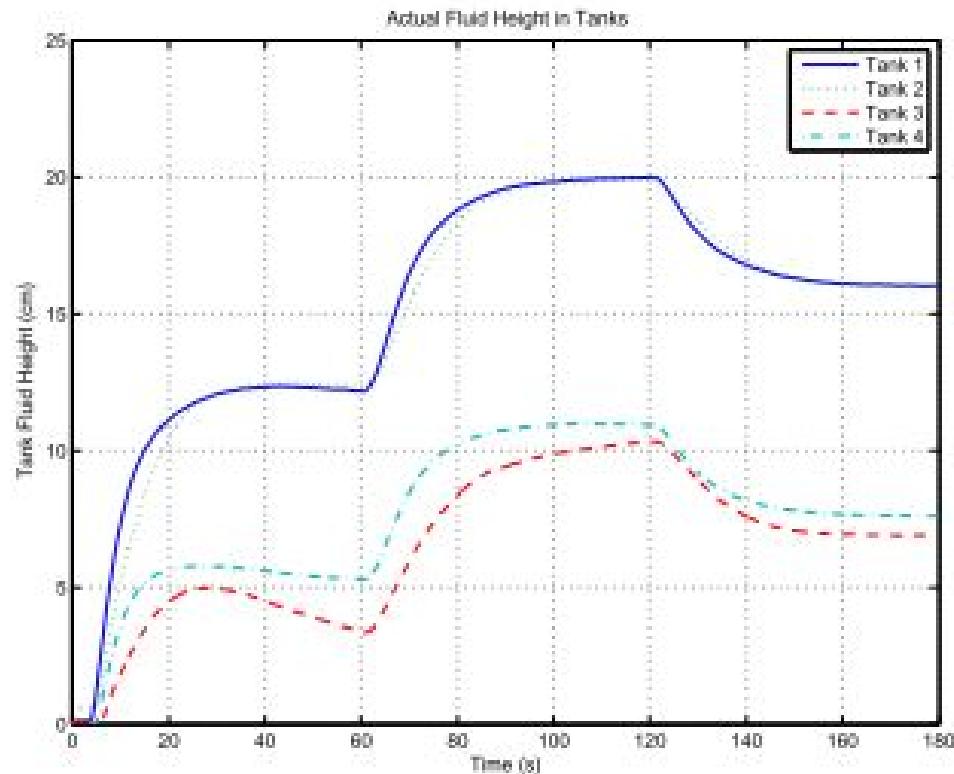


Figure 69: Actual tank fluid height responses  
[5]

We have compared the simulation and the experimental results above.

- From the comparison, it can be seen that both the responses are almost identical.  
Hence it can be used for developing of control law for the control of bottom two tanks[5].

### 8.2.1 Tracking

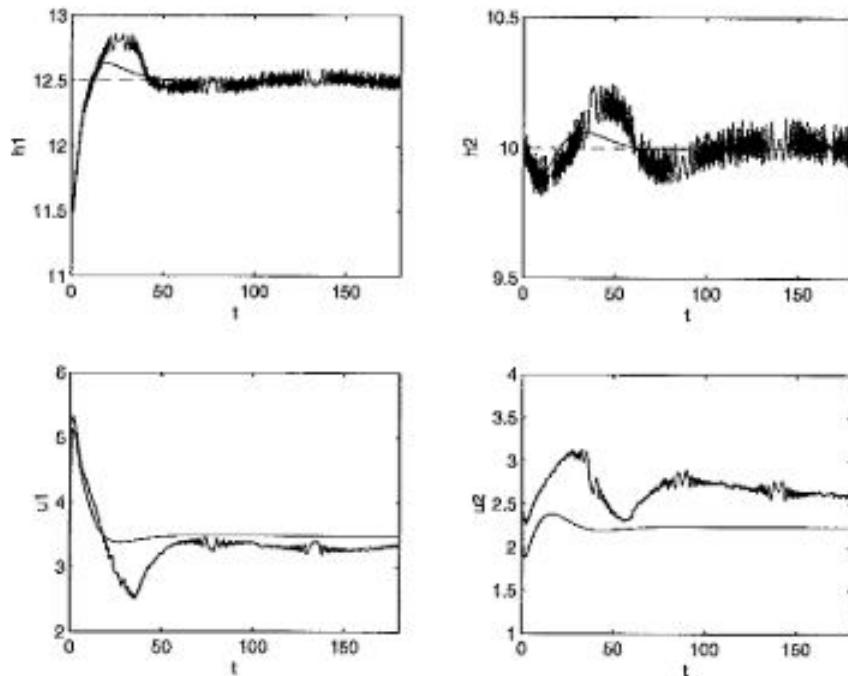


Figure 70: Minimum phase Kalman Step Response.

[7]

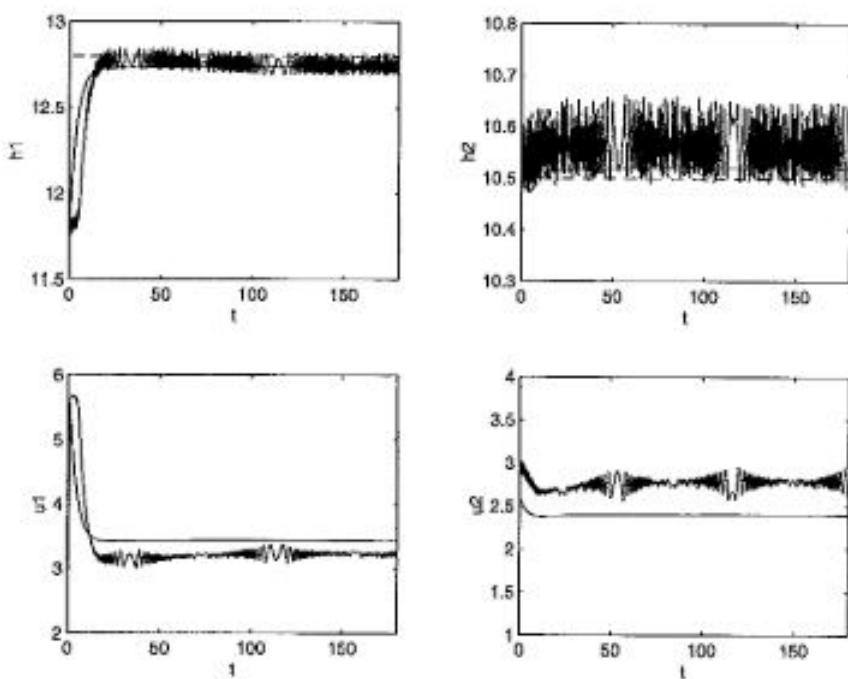


Figure 71: Minimum phase LQG Step Response

[7]

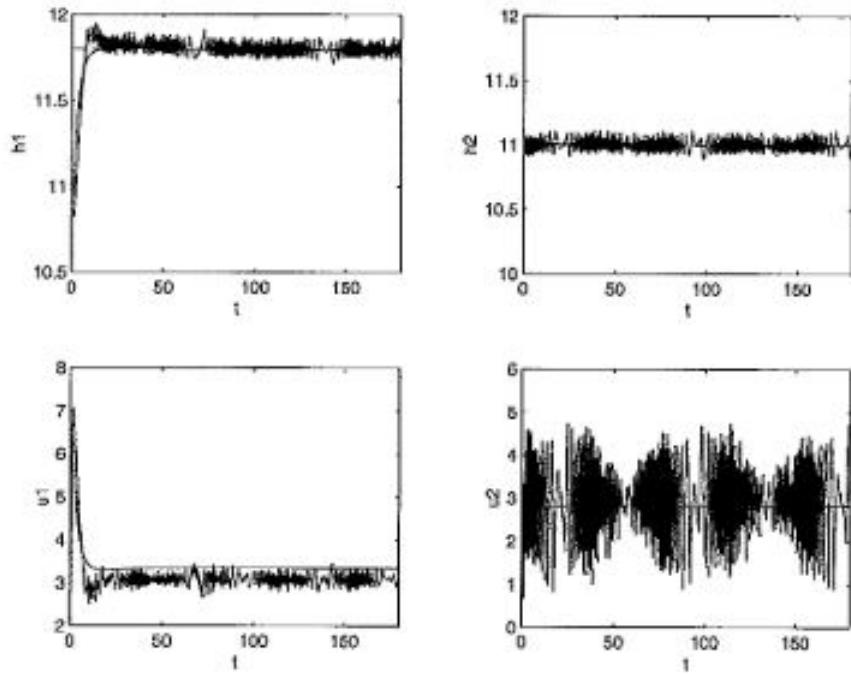


Figure 72: Minimum phase H-Infinity Step Response  
[7]

### 8.2.2 Disturbance Rejection

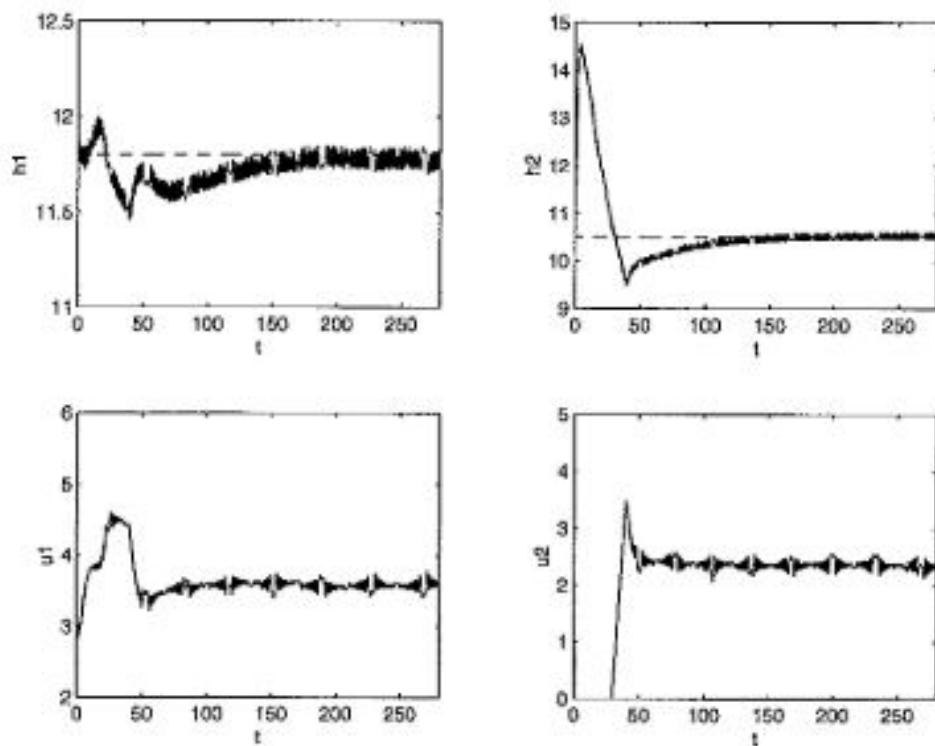


Figure 73: Minimum phase LQG Disturbance Rejection.  
[7]

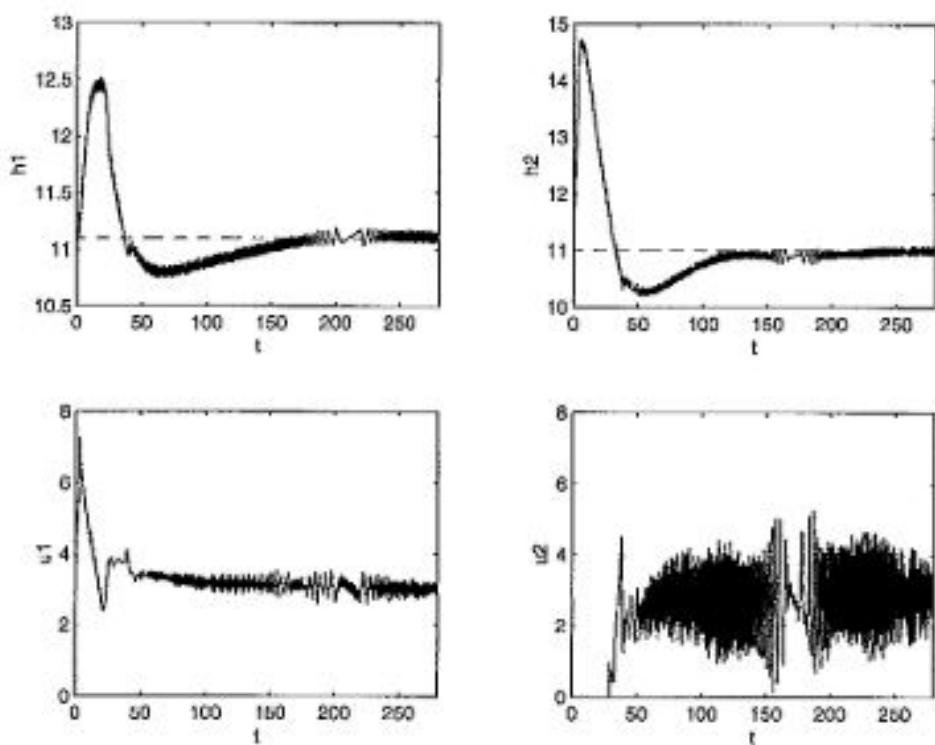


Figure 74: Minimum phase H-Infinity Disturbance Rejection  
[7]

## 9 Summary and Conclusions

From the above analysis it is observed that the settling time for LQR controller is the least compared to all the other designs. Most of the control designs satisfied the conditions of

$$|S| \leq 2dB \text{ and } |T| \leq 6dB.$$

•LQG does not guarantee nice properties. In addition, if RHP zeros or RHP poles are present then it may not give good results. The H-Infinity controllers have less overshoot as compared to others.

Closed Loop Controllers	95% Settling Time (seconds)	Sensitivity Peak	Complimentary Sensitivity Peak	Overshoot (Percentage)
LQR Minimum Phase	0.968, 1.17	0	2.303	20,17
LQR Non-Minimum Phase	1.29, 1.61	0	2.594	20,22
Kalman Filter Minimum Phase	-	0	3.055	-
Kalman Filter Non-Minimum Phase	-	1.906	3.702	-
LQG Minimum Phase	23.2, 39.9	22.23	21.61	31, 290
LQG Non-Minimum Phase	32.1, 123	6.008	5.158	29, 46
H-Infinity Minimum Phase	66.8, 797	1.68	0.458	6,0
H-Infinity Non-Minimum Phase	45.6,219	1.71	1.37	14,1

Table 8: Performance Parameter Analysis

- The smallest settling time of the control methods is LQR, and the highest one is H-Infinity.
- In LQG an external noise is added to the model which affects the results, but the controller attains steady state.

## 10 Cited References

### References

- [1] Controllability(wikipedia).
- [2] Observability(wikipedia).
- [3] Poles and zeros(wikibooks).
- [4] Asyraf bin Maskan. *Dynamic Simulation of Quadruple Tank System*. PhD thesis, 2011.
- [5] Daniel Desautel. Digital State Space Control of the Quadruple-Tank Process. *Open Access Master's Theses*, 2014.

- [6] E. Govinda Kumar, B. Shiva Ram, U. B. Deepak, and G. Sabarinathan. The quadruple tank process with an interaction: A mathematical model. *International Journal of Engineering and Technology(UAE)*, 7(2):172–176, 2018.
- [7] Michael Grebeck. A Comparison of Controllers for the Quadruple Tank System. Technical report, 1998.
- [8] J. Jayaprakash and M. E.Hari Kumar. State variable analysis of four tank system. *Proceeding of the IEEE International Conference on Green Computing, Communication and Electrical Engineering, ICGCCEE 2014*, (November), 2014.
- [9] Karl Henrik Johansson. The quadruple-tank process: A multivariable laboratory process with an adjustable zero. *IEEE Transactions on Control Systems Technology*, 8(3):456–465, 2000.
- [10] Karl Henrik Johansson, Alexander Horch, Olle Wijk, and Anders Hansson. Teaching Multivariable Control Using the Quadruple-Tank Process. *Electrical Engineering*, pages 1–6, 1999.
- [11] Karl Henrik Johansson and José Luís Rocha Nunes. A multivariable laboratory process with an adjustable zero. *Proceedings of the American Control Conference*, 4(3):2045–2049, 1998.
- [12] Dr. Armando Rodriguez. *Analysis and Design of Multivariable Feedback Control Systems*. Control3d,LLC, 2004.
- [13] R. Vadigepalli, E. P. Gatzke, and F. J. Doyle. Robust control of a multivariable experimental four-tank system. *Industrial and Engineering Chemistry Research*, 40(8):1916–1927, 2001.
- [14] Ademu Okpanachi Victor. Developing Advanced Control strategies for a 4-Tank Laboratory process(Master Thesis), 2010.

## 11 Relevant Matlab Code

```

1 %% Quadruple Tank Apparatus/ Four Tank Process for Minimum and
2   ↳ Non-Minimum Phase
3 % SHUBHAM S GHARAT ASU ID 1217348912
4 clear all;close all;clc;
5 s=tf("s");
6
7 %% Minimum Phase Characteristics
8 %minimum phase Time constants
9 A1=28;A3=28;A2=32;A4=32;
10 alpha1=0.071;alpha3=0.071;alpha2=0.057;alpha4=0.057;
11 Kc=0.50;g=981;
12 T1=62;T2=90;T3=23;T4=30;
13 h1=12.4;h2=12.7;h3=1.8;h4=1.4;
14 v1=3;v2=3;k1=3.33;k2=3.35;
15 gamma1=0.70;gamma2=0.60;
16 A_min_phase=[-(1/T1) 0 A3/(1*T3) 0; 0 -(1/T2) 0 A4/(A2*T4);0 0
17   ↳ -(1/T3) 0;0 0 0 -(1/T4)];
17 B_min_phase=[(gamma1*k1)/A1 0;0 (gamma2*k2)/A2;0
18   ↳ ((1-gamma2)*k2)/A3; ((1-gamma1)*k1)/A4 0];

```

```

18 C_min_phase=[Kc 0 0 0;0 Kc 0 0 ];
19 D_min_phase=0;
20 c1=(T1*k1*Kc)/A1;c2=(T2*k2*Kc)/A2;
21 P1_min=ss(A_min_phase,B_min_phase,C_min_phase,D_min_phase);
22 G_s_min_phase=[ (gamma1*c1)/(1+s*T1)
    ↳ ((1-gamma2)*c1)/((1+s*T3)*(1+s*T1));
    ↳ ((1-gamma1)*c2)/((1+s*T4)*(1+s*T2)) ((gamma2*c2)/(1+s*T2)) ]
23 eigenvalues_A_min_phase= eig(A_min_phase)
24 pzmap(P1_min);
25 title('pole-zero map for minimum phase')
26 grid on;figure;
27
28 w=logspace(-3,3,1000);
29 sv=sigma(P1_min,w);
30 tsv=20*log10(sv);
31 semilogx(w,tsv);
32 title('SVD of the plant for Min Phase');
33 grid on;figure;
34 xlabel('Frequency (rad/sec)');
35 ylabel('Singular Values (dB)');
36
37
38
39 disp("Poles of Minimum Phase operating point")
40 p1_min=pole(G_s_min_phase(1,1))
41 p2_min=pole(G_s_min_phase(1,2))
42 p3_min=pole(G_s_min_phase(2,1))
43 p4_min=pole(G_s_min_phase(2,2))
44 tx_zeroes = tzero(P1_min)
45
46 bode((G_s_min_phase(1,1)),{0.001,10000});
47 title('G(s)min phase(1,1)')
48 ylim([-100 10]);
49 grid on;figure;
50 bode(G_s_min_phase(1,2),{0.001,10000});
51 title('G(s)min phase(1,2)')
52 ylim([-190 10]);
53 grid on;figure;
54 bode(G_s_min_phase(2,1),{0.001,10000});
55 title('G(s)min phase(2,1)')
56 ylim([-190 10]);

```

```

57 grid on;
58 figure;grid on;
59 bode(G_s_min_phase(2,2),{0.001,10000});
60 title('G(s)min phase(2,2)')
61 ylim([-100 10]);
62 grid on;
63
64 % TFM minimum phase
65 A1=28;A3=28;A2=32;A4=32;
66 alpha1=0.071;alpha3=0.071;alpha2=0.057;alpha4=0.057;
67 Kc=0.50;g=981;s=0;
68 T1=62;T2=90;T3=23;T4=30;
69 h1=12.4;h2=12.7;h3=1.8;h4=1.4;
70 v1=3;v2=3;
71 k1=3.33;k2=3.35;
72 gamma1=0.70;gamma2=0.60;
73
74 A_min_phase=[-(1/T1) 0 A3/(1*T3) 0; 0 -(1/T2) 0 A4/(A2*T4);0 0
   ↵ -(1/T3) 0;0 0 0 -(1/T4)];
75 B_min_phase=[(gamma1*k1)/A1 0;0 ((1-gamma2)*k2)/A2;0
   ↵ ((1-gamma2)*k2)/A3; ((1-gamma1)*k1)/A4 0];
76 C_min_phase=[Kc 0 0 0;0 Kc 0 0] ;
77 disp("D_min_phase = 0")
78
79 c1=(T1*k1*Kc)/A1;c2=(T2*k2*Kc)/A2;
80 disp('Dc Gain Matrix min phase')
81 G_s_min_phase=[ (gamma1*c1)/(1+s*T1)
   ↵ ((1-gamma2)*c1)/((1+s*T3)*(1+s*T1));
   ↵ ((1-gamma1)*c2)/((1+s*T4)*(1+s*T2)) ((gamma2*c2)/(1+s*T2))]
82 [udc_min,sdc_min,vdc_min]=svd(G_s_min_phase)
83 Controllability_min_phase=ctrb (A_min_phase,B_min_phase);
84 rank_controllability_matrix_min_phase=rank(Controllability_min_phase)
85 Observability_min_phase=obsv(A_min_phase,C_min_phase);
86 rank_observability_matrix_min_phase=rank(Observability_min_phase)
87
88 [ns nc]=size(B_min_phase);
89 no=nc; %Number of outputs
90
91 %Augmenting plant with integrator for zero steady state error to
   ↵ step
92 %inputs in each control channel

```

```

93
94 A_Min=[A_min_phase B_min_phase
95     0*ones(nc,ns) 0*ones(nc,nc)];;
96 B_Min=[0*ones(ns,nc)
97     eye(nc)];
98 C_Min=[C_min_phase 0*ones(nc,nc)];
99 D_Min=0*ones(nc,nc);
100 P=ss(A_Min,B_Min,C_Min,D_Min);
101 pp_=eig(P);
102 p_tz=tzero(P);
103 figure;
104 sv=sigma(P,w);
105 tsv=20*log10(sv);
106 semilogx(w,tsv);
107 title('SVD of the plant after Dynamic Integral Augmentation');
108 grid on;
109 xlabel('Frequency (rad/sec)');
110 ylabel('Singular Values (dB)');
111
112 %Augmented plant has slope of -20dB/dec at low frequencies
113 %Plant has complex poles on LHP near imag axis so Bilinear
114 %→ transformation
115 %has to be performed
116 p1=-0.09; p2=-1e20;
117 [A,B,C,D]=bilin(A_Min,B_Min,C_Min,D_Min,1,'Sft_jw',[p2 p1]);
118 sys=ss(A,B,C,D);
119 poles=eig(sys);
120 zeros=tzero(sys);
121 %Using BLT, complex LHP poles are moved to RHP
122 figure;
123 sv=sigma(sys,w);
124 tsv=20*log10(sv);
125 semilogx(w,tsv);
126 title('SVD of the plant after Bilinear transformation');
127 grid on;
128 xlabel('Frequency (rad/sec)');
129 ylabel('Singular Values (dB)');
130
131 %LQR Design with augmented plant
132 q=C'*C;
133 rho =1e-6;

```

```

133 % rho_1=1e-15;
134 r = rho*eye(nc);
135 % r_1 = rho1*eye(nc);
136 [G, poles, K] = lqr(A,B,q,r);
137 % [G_1, poles_1, K_1] = lqr(A,B,q,r_1);
138 Glqr1=ss(A,B,G,0);
139 disp('EigenValues with LQR');
140 lqrp1=eig(A-B*G)
141 disp('Transmission Zeros with LQR');
142 lqrtz1=tzero(Glqr1)
143 [ak1,bk1,ck1,dk1]=bilin(Glqr1.A,Glqr1.B,Glqr1.C,Glqr1.D,-1,'Sft_jw',[p2
    ↪ p1]);
144 K1=ss(ak1,bk1,ck1,dk1);%K1=L=PK
145 So_min=inv(eye(size(K1))+K1);
146 To_min=eye(size(K1))-So_min;%Te=PK*inv[I+PK]
147 figure;
148 sv=sigma(To_min,w);
149 tsv=20*log10(sv);
150 semilogx(w,tsv);
151 title('Sensitivity (S) using LQR for Minimum Phase');
152 grid on;
153 xlabel('Frequency (rad/sec)');
154 ylabel('Singular Values (dB)');
155 figure;
156 sv=sigma(To_min,w);
157 tsv=20*log10(sv);
158 semilogx(w,tsv);
159 title('Complementary Sensitivity (T) using LQR for Minimum
    ↪ Phase');
160 grid on;
161 xlabel('Frequency (rad/sec)');
162 ylabel('Singular Values (dB)');
163
164 %check tzero of K1
165 tzero(K1);
166 figure;
167 step(To_min);
168 title('Step response using LQR for Minimum Phase');
169 grid on;
170 xlabel('Frequency (rad/sec)');
171 ylabel('Magnitude');

```

```

172
173 %Kalman filter Design
174 pinteg=eye(nc);
175 mu=5;
176 minteg=mu*eye(nc);
177 [Kkf, H, sig]=kalman(sys,pinteg,minteg);
178 Gkf=ss(A-H*C,H,-C,0);
179 kfp=eig(A-H*C)
180 kftz=tzero(Gkf);
181 [akal,bkal,ckal,dkal]=bilin(Gkf.A,Gkf.B,Gkf.C,Gkf.D,-1,'Sft_jw',[p2
   ↳ p1]);
182 K_l=ss(akal,bkal,ckal,dkal);
183 [Lo_1,Li_1,So_1,Si_1,To_1,Ti_1,KS_1,SP_1]=f_CLTFM(P,K_l);
184 figure;
185 sv=sigma(So_1,w);
186 tsv=20*log10(sv);
187 semilogx(w,tsv);
188 title('Sensitivity (S) using Kalman for Minimum Phase');
189 grid on;
190 xlabel('Frequency (rad/sec)');
191 ylabel('Singular Values (dB)');
192 figure;
193 sv=sigma(To_1,w);
194 tsv=20*log10(sv);
195 semilogx(w,tsv);
196 title('Complementary Sensitivity (T) using Kalman for Minimum
   ↳ Phase');
197 grid on;
198 xlabel('Frequency (rad/sec)');
199 ylabel('Singular Values (dB)');
200
201 figure;
202 step(To_1);
203 title('Step response using Kalman for Minimum Phase');
204 grid on;
205 xlabel('Frequency (rad/sec)');
206 ylabel('Magnitude')
207
208 %LQG Design-----
209 Am=A-B*G-H*C;

```

```

211 Bm=H;
212 Cm=G;
213 Dm=0;
214 Glqg=ss(Am,Bm,Cm,Dm);
215 lqgp=eig(A-B*G-H*C);
216 lqgtz=tzero(Glqg);
217 [ak,bk,ck,dk]=bilin(Glqg.A,Glqg.B,Glqg.C,Glqg.D,-1,'Sft_jw',[p2
   ↳ p1]);
218 K2=ss(ak,bk,ck,dk);
219 [Lo2,Li2,So2,Si2,To2,Ti2,KS2,SP2]=f_CLTFM(P,K2);
220 figure;
221 sv=sigma(So2,w);
222 tsv=20*log10(sv);
223 semilogx(w,tsv);
224 title('Sensitivity (S) using LQG for Minimum Phase');
225 grid on;
226 xlabel('Frequency (rad/sec)');
227 ylabel('Singular Values (dB)');
228 figure;
229 sv=sigma(To2,w);
230 tsv=20*log10(sv);
231 semilogx(w,tsv);
232 title('Complementary Sensitivity (T) using LQG for Minimum
   ↳ Phase');
233 grid on;
234 xlabel('Frequency (rad/sec)');
235 ylabel('Singular Values (dB)');
236 % figure;
237 % sv=sigma(KS2,w);
238 % tsv=20*log10(sv);
239 % semilogx(w,tsv);
240 % title('K-Sensitivity (KS) using LQG');
241 % grid on;
242 % xlabel('Frequency (rad/sec)');
243 % ylabel('Singular Values (dB)');
244 tzero(K2)
245 figure;
246 step(To2);
247 title('Step response using LQG for Minimum Phase');
248 grid on;
249 xlabel('Frequency (rad/sec)');

```

```

250 ylabel('Magnitude');

251

252

253 %H-infinity Control design

254

255 % *****
256 % Form the state-space model of the scaled plant
257 %P=ss(ap,bp,cp,dp);
258 P=ss(A_min_phase,B_min_phase,C_min_phase,D_min_phase);

259

260 % *****
261 % Weights
262 % Standard first order weights are chosen
263 % For any non-standard/higher-order weights, form the transfer
    → functions
264 % appropriately
265 % See AAR's book for details on higher-order weights
266 % M11=0.22; w11=0.12; Eps11=0.40; M12=0.22; w12=0.12;
    → Eps12=0.40;
267 M11=0.037;w11=0.00025;Eps11=0.0001;
    → M12=0.037;w12=0.00025;Eps12=0.0001;
268 W1 = [tf([1/M11 w11], [1 w11*Eps11]) 0; 0 tf([1/M12 w12], [1
    → w12*Eps12])];
269 figure;
270 w=logspace(-3,3,1000);
271 sigma(inv(W1),w)
272 title('Inverse of Weighting matrix W1');
273 grid on;
274 xlabel('Frequency (rad/sec)');
275 ylabel('Singular Values (dB)');
276 %
277 M21=500; w21=100; Eps21=0.0001; M22=500; w22=100; Eps22=0.0001;
278 % % M21=100; w21=10000; Eps21=0.1; M22=100; w22=10000;
    → Eps22=0.1;
279 W2 = [tf([1 w21/M21], [Eps21 w21]) 0; 0 tf([1 w22/M22], [Eps22
    → w22])];
280 figure;
281 w=logspace(-3,3,1000);
282 sigma(inv(W2),w)
283 title('Inverse of Weighting matrix W2');
284 grid on;

```

```

285 xlabel('Frequency (rad/sec)');
286 ylabel('Singular Values (dB)');
287 % % Mu=0.25;
288 % % W2=Mu;

289
290 %
291 M31=0.01; w31=30000; Eps31=0.00001; M32=0.01; w32=30000;
292 % M31=2; w31=3.1; Eps31=0.01; M32=2; w32=3.1; Eps32=0.01;
293 W3 = [tf([1 w31/M31], [Eps31 w31]) 0; 0 tf([1 w32/M32], [Eps32
294 % w32])] ;
295 figure;
296 w=logspace(-3,3,1000);
297 sigma(inv(W3),w)
298 title('Inverse of Weighting matrix W3');
299 grid on;
300 xlabel('Frequency (rad/sec)');
301 ylabel('Singular Values (dB)');

302
303 % ****
304 % Generalized plant
305 % Standard weight augmentation using Matlab's augw command
306 % For any non-standard augmentation of weights, form the
307 % Generalized plant
308 % manually using state-space methods
309 GenP=augw(P,W1,W2,W3);

310 % ****
311 % Obtain controller using Matlab's hinfsyn command
312 % See help on hinfsyn for more options
313 K=hinfsyn(GenP);
314 % ncont = 2;
315 % nmeas = 2;
316 % [K,CL,gamma] = hinfsyn(GenP,nmeas,ncont);
317 % ****
318 % Form closed loop maps
319 % f_CLTFM.m is a matlab function for computing OL and CL maps in
320 % a standard
321 % output feedback structure. This file must be in the current
322 % Matlab folder

```

```

321 [Lo,Li,So, Si, To, Ti, KS, PS] = f_CLTFM(P,K);
322
323 % Can add prefilter if needed
324
325 % PLOTS
326 wvec=logspace(-3,3,10000);
327
328 figure;
329 sigma( So,wvec);
330 title('Sensitivity using H Infinity for Minimum Phase')
331 grid
332 xlabel('Frequency (rad/sec)')
333 ylabel('Singular Values (dB)')
334
335
336
337 figure;
338 sigma( To,wvec);
339 title('Complementary Sensitivity using H Infinity for Minimum
    → Phase')
340 grid
341 xlabel('Frequency (rad/sec)')
342 ylabel('Singular Values (dB)')
343
344 figure;
345 sv=sigma(KS,w);
346 tsv=20*log10(sv);
347 semilogx(w,tsv);
348 title('K-Sensitivity (KS) using H-infinity');
349 grid on;
350 xlabel('Frequency (rad/sec)');
351 ylabel('Singular Values (dB)');
352
353 figure;
354 step(To);
355 title('Step response using H-infinity');
356 grid on;
357 xlabel('Frequency (rad/sec)');
358 ylabel('Magnitude');
359 figure;
360

```

```

361 %% Non-Minimum Phase Characteristics
362 %TFM non minimum phase
363 A1=28;A3=28;A2=32;A4=32;
364 alpha1=0.071;alpha3=0.071;alpha2=0.057;alpha4=0.057;
365 Kc=0.50;g=981;s=0;
366 T1=63;T2=91;T3=39;T4=56;
367 h1=12.6;h2=13;h3=4.8;h4=4.9;
368 v1=3.15;v2=3.15;k1=3.14;k2=3.29;
369 gamma1=0.43;gamma2=0.34;
370
371 A_non_min_phase=[-(1/T1) 0 A3/(1*T3) 0; 0 -(1/T2) 0 A4/(A2*T4);0 0
372   ↵ -(1/T3) 0;0 0 0 -(1/T4)];
372 B_non_min_phase=[(gamma1*k1)/A1 0;0 (gamma2*k2)/A2;0
373   ↵ ((1-gamma2)*k2)/A3; ((1-gamma1)*k1)/A4 0];
373 C_non_min_phase=[Kc 0 0 0;0 Kc 0 0] ;
374 disp("D_non_min_phase = 0");
375 c1=(T1*k1*Kc)/A1;
376 c2=(T2*k2*Kc)/A2;
377 disp('Dc Gain Matrix non min phase');
378
379 G_s_non_min_phase=[ (gamma1*c1)/(1+s*T1)
380   ↵ ((1-gamma2)*c1)/((1+s*T3)*(1+s*T1));
380   ↵ ((1-gamma1)*c2)/((1+s*T4)*(1+s*T2)) ((gamma2*c2)/(1+s*T2))]
380 [udc_non_min,sdc_non_min,vdc_non_min]=svd(G_s_non_min_phase)
381 Controllability_non_min_phase=ctrb
382   ↵ (A_non_min_phase,B_non_min_phase);
382 rank_controllability_matrix_non_min_phase=rank(Controllability_non_min_ph
383 Observability_non_min_phase=obsv(A_non_min_phase,C_non_min_phase);
384 rank_observability_matrix_non_min_phase=rank(Observability_non_min_phase)
385
386 clear all
387 s=tf("s");
388 A1=28;A3=28;A2=32;A4=32;
389 alpha1=0.071;alpha3=0.071;
390 alpha2=0.057;alpha4=0.057;
391 Kc=0.50;g=981;
392
393 % Non-minimum phase Time constants
394 T1=63;T2=91;T3=39;T4=56;
395 h1=12.6;h2=13;h3=4.8;h4=4.9;
396 v1=3.15;v2=3.15;

```

```

397 k1=3.14;k2=3.29;
398 gamma1=0.43;gamma2=0.34;
399
400 A_non_min_phase=[-(1/T1) 0 A3/(1*T3) 0; 0 -(1/T2) 0 A4/(A2*T4);0 0
   ↵ -(1/T3) 0;0 0 0 -(1/T4)];
401 B_non_min_phase=[(gamma1*k1)/A1 0;0 (gamma2*k2)/A2;0
   ↵ ((1-gamma2)*k2)/A3; ((1-gamma1)*k1)/A4 0];
402 C_non_min_phase=[Kc 0 0 0;0 Kc 0 0] ;
403 D_non_min_phase=0;
404
405 c1=(T1*k1*Kc)/A1;c2=(T2*k2*Kc)/A2;
406
407 G_s_non_min_phase=[ (gamma1*c1)/(1+s*T1)
   ↵ ((1-gamma2)*c1)/((1+s*T3)*(1+s*T1));
   ↵ ((1-gamma1)*c2)/((1+s*T4)*(1+s*T2)) ((gamma2*c2)/(1+s*T2))]
408 eigenvalues_A_non_min_phase= eig(A_non_min_phase)
409 P1_non_min=ss(A_non_min_phase,B_non_min_phase,C_non_min_phase,D_non_min_ph
410 pzmap(P1_non_min);
411 title('pole-zero map for non minimum phase')
412 grid on;figure;
413
414
415 w=logspace(-3,3,1000);
416 sv=sigma(P1_non_min,w);
417 tsv=20*log10(sv);
418 semilogx(w,tsv);
419 title('SVD of the plant for Non-Min Phase');
420 grid on;
421 figure;
422 xlabel('Frequency (rad/sec)');
423 ylabel('Singular Values (dB)');
424
425 disp("Poles of Non Minimum Phase operating point")
426 p1_non_min=pole(G_s_non_min_phase(1,1))
427 p2_non_min=pole(G_s_non_min_phase(1,2))
428 p3_non_min=pole(G_s_non_min_phase(2,1))
429 p4_non_min=pole(G_s_non_min_phase(2,2))
430
431 bode(G_s_non_min_phase(1,1),{0.001,10000});
432 title('G(s) non-min phase(1,1)')
433 ylim([-100 10]);

```

```

434 grid on;
435 figure;
436
437 bode(G_s_non_min_phase(1,2),{0.001,10000});
438 title('G(s) non-min phase(1,2)')
439 ylim([-190 10]);
440 grid on;
441 figure;
442
443 bode(G_s_non_min_phase(2,1),{0.001,10000});
444 title('G(s) non-min phase(2,1)')
445 ylim([-190 10]);
446 grid on;
447 figure;
448
449 bode(G_s_non_min_phase(2,2),{0.001,10000});
450 title('G(s) non-min phase(2,2)')
451 ylim([-100 10]);
452 grid on;
453
454 [ns nc]=size(B_non_min_phase);
455 no=nc; %Number of outputs
456 %Augmenting plant with integrator for zero steady state error to
457 %→ step
458 %inputs in each control channel
459
460 A_non_Min=[A_non_min_phase B_non_min_phase
461 0*ones(nc,ns) 0*ones(nc,nc)];
462 B_non_Min=[0*ones(ns,nc)
463 eye(nc)];
464 C_non_Min=[C_non_min_phase 0*ones(nc,nc)];
465 D_non_Min=0*ones(nc,nc);
466 P_nm=ss(A_non_Min,B_non_Min,C_non_Min,D_non_Min);
467 pp_nm=eig(P_nm);
468 p_nm_tz=tzero(P_nm);
469 figure;
470 sv=sigma(P_nm,w);
471 tsv=20*log10(sv);
472 semilogx(w,tsv);
473 title('SVD of the plant after Dynamic Integral Augmentation for
474 %→ Non Minimum Phase');

```

```

473 grid on;
474 xlabel('Frequency (rad/sec)');
475 ylabel('Singular Values (dB)');
476
477 %Augmented plant has slope of -20dB/dec at low freq.s
478 %Plant has complex poles on LHP near imag axis at -0.00236 +/- 
479 %      0.0975j
480 %Bilinear transformation has to be done
481 p1=-0.009; p2=-1e20;
482 [A_nm,B_nm,C_nm,D_nm]=bilin(A_non_Min,B_non_Min,C_non_Min,D_non_Min,1,'Sft
483 %with integrator states
484 sys=ss(A_nm,B_nm,C_nm,D_nm);
485 poles_nm=eig(sys);
486 zeros_nm=tzero(sys);
487 %Using BLT, complex LHP poles are moved to RHP at 0.0708 +/- 
488 %      0.0975i, along
489 %with integrator states
490 figure;
491 sv=sigma(sys,w);
492 tsv=20*log10(sv);
493 semilogx(w,tsv);
494 title('SVD of the plant after Bilinear transformation for Non
495 %LQR Design-----
496 q=C_nm'*C_nm;
497 rho = 1e-6;
498 r = rho*eye(nc);
499 [G, poles_nm, K_nm] = lqr(A_nm,B_nm,q,r);
500 Glqr=ss(A_nm,B_nm,G,0);
501 lqrp=eig(A_nm-B_nm*G);
502 lqrtz=tzero(Glqr);
503 [ak,bk,ck,dk]=bilin(Glqr.A,Glqr.B,Glqr.C,Glqr.D,-1,'Sft_jw',[p2
504 %      p1]);
505 K1=ss(ak,bk,ck,dk);%K1=L=PK
506 So_non_min=inv(eye(size(K1))+K1);
507 To_non_min=eye(size(K1))-So_non_min;%Te=PK*inv[I+PK]
508 figure;

```

```

509 sv=sigma(So_non_min,w);
510 tsv=20*log10(sv);
511 semilogx(w,tsv);
512 title('Sensitivity (S) using LQR for Non Minimum Phase');
513 grid on;
514 xlabel('Frequency (rad/sec)');
515 ylabel('Singular Values (dB)');
516 figure;
517 sv=sigma(To_non_min,w);
518 tsv=20*log10(sv);
519 semilogx(w,tsv);
520 title('Complementary Sensitivity (T) using LQR for Non Minimum
      → Phase');
521 grid on;
522 xlabel('Frequency (rad/sec)');
523 ylabel('Singular Values (dB)');
524 %check tzero of K1
525 tzero(K1)
526 figure;
527 step(To_non_min);
528 title('Step response using LQR without prefilter for Non Minimum
      → Phase');
529 grid on;
530 xlabel('Frequency (rad/sec)');
531 ylabel('Magnitude');
532 %Prefilter
533 dom_zero_real=-10.1033;
534 dom_zero_imag=10.4622;
535 dom_zero=dom_zero_real+dom_zero_imag*j;
536 fil_num=dom_zero*conj(dom_zero);
537 fil_den=(s-dom_zero)*(s-conj(dom_zero));
538 fil=fil_num/fil_den;
539 fil=fil*eye(2);
540 Try_f= fil * To_non_min;
541 figure;
542 sv=sigma(Try_f,w);
543 tsv=20*log10(sv);
544 semilogx(w,tsv);
545 title('Complementary Sensitivity (T) using LQR and prefilter for
      → Non Minimum Phase');
546 grid on;

```

```

547 xlabel('Frequency (rad/sec)');
548 ylabel('Singular Values (dB)');
549
550
551 %Kalman filter Design-----
552 pnteg=eye(nc);
553 mu=20;
554 minteg=mu*eye(nc);
555 [Kkf , H, sig]=kalman(sys,pnteg,minteg);
556 Gkf=ss(A_nm-H*C_nm,H,-C_nm,0);
557 kfp=eig(A_nm-H*C_nm);
558 kftz=tzero(Gkf);
559 [akal,bkal,ckal,dkal]=bilin(Gkf.A,Gkf.B,Gkf.C,Gkf.D,-1,'Sft_jw',[p2
    ↳ p1]);
560 K_l=ss(akal,bkal,ckal,dkal);
561 [Lo_1,Li_1,So_1,Si_1,To_1,Ti_1,KS_1,SP_1]=f_CLTFM(P_nm,K_l);
562 figure;
563 sv=sigma(So_1,w);
564 tsv=20*log10(sv);
565 semilogx(w,tsv);
566 title('Sensitivity (S) using Kalman for Non Minimum Phase');
567 grid on;
568 xlabel('Frequency (rad/sec)');
569 ylabel('Singular Values (dB)');
570 figure;
571 sv=sigma(To_1,w);
572 tsv=20*log10(sv);
573 semilogx(w,tsv);
574 title('Complementary Sensitivity (T) using Kalman for Non Minimum
    ↳ Phase');
575 grid on;
576 xlabel('Frequency (rad/sec)');
577 ylabel('Singular Values (dB)');
578 figure;
579 step(To_1);
580 title('Step response using Kalman for Non minimum Phase');
581 grid on;
582 xlabel('Frequency (rad/sec)');
583 ylabel('Magnitude');
584
585 %LQG Design-----

```

```

586 Am=A_nm-B_nm*G-H*C_nm;
587 Bm=H;
588 Cm=G;
589 Dm=0;
590 Glqg=ss(Am,Bm,Cm,Dm);
591 lqgp=eig(A_nm-B_nm*G-H*C_nm);
592 lqgtz=tzero(Glqg);
593 [ak,bk,ck,dk]=bilin(Glqg.A,Glqg.B,Glqg.C,Glqg.D,-1,'Sft_jw',[p2
    ↪ p1]);
594 K2=ss(ak,bk,ck,dk);
595 [Lo2,Li2,So2,Si2,To2,Ti2,KS2,SP2]=f_CLTFM(P_nm,K2);
596 figure;
597 w=logspace(-3,3,1000);
598 sv=sigma(So2,w);
599 tsv=20*log10(sv);
600 semilogx(w,tsv);
601 title('Sensitivity (S) using LQG for Non minimum Phase');
602 grid on;
603 xlabel('Frequency (rad/sec)');
604 ylabel('Singular Values (dB)');
605 figure;
606 sv=sigma(To2,w);
607 tsv=20*log10(sv);
608 semilogx(w,tsv);
609 title('Complementary Sensitivity (T) using LQG for Non minimum
    ↪ Phase');
610 grid on;
611 xlabel('Frequency (rad/sec)');
612 ylabel('Singular Values (dB)');
613 tzero(K2)
614 figure;
615 step(To2);
616 title('Step response using LQG for Non minimum Phase');
617 grid on;
618 xlabel('Frequency (rad/sec)');
619 ylabel('Magnitude');

620
621 % H-infinity Control design
622
623 % ****
624 % Form the state-space model of the scaled plant

```

```

625 %P=ss(ap,bp,cp,dp);
626 P_nm=ss(A_non_min_phase,B_non_min_phase,C_non_min_phase,D_non_min_phase);
627 %
628 % ****
629 % Weights
630 % Standard first order weights are chosen
631 % For any non-standard/higher-order weights, form the transfer
   → functions
632 % appropriately
633 % See AAR's book for details on higher-order weights
634 % M11=0.22; w11=0.12; Eps11=0.40; M12=0.22; w12=0.12;
   → Eps12=0.40;
635 M11_nm=0.001;w11_nm=0.00025;Eps11_nm=0.0001;
   → M12_nm=0.001;w12_nm=0.00025;Eps12_nm=0.0001;
636 W1_nm = [tf([1/M11_nm w11_nm], [1 w11_nm*Eps11_nm]) 0; 0
   → tf([1/M12_nm w12_nm], [1 w12_nm*Eps12_nm])];
637 figure;
638 w=logspace(-3,3,1000);
639 sigma(inv(W1_nm),w)
640 title('Inverse of Weighting matrix W1');
641 grid on;
642 xlabel('Frequency (rad/sec)');
643 ylabel('Singular Values (dB)');
644 %
645 M21_nm=50; w21_nm=50; Eps21_nm=0.0001; M22_nm=50; w22_nm=50;
   → Eps22_nm=0.0001;
646 % % M21=100; w21=10000; Eps21=0.1; M22=100; w22=10000;
   → Eps22=0.1;
647 W2_nm = [tf([1 w21_nm/M21_nm], [Eps21_nm w21_nm]) 0; 0 tf([1
   → w22_nm/M22_nm], [Eps22_nm w22_nm])];
648 figure;
649 w=logspace(-3,3,1000);
650 sigma(inv(W2_nm),w)
651 title('Inverse of Weighting matrix W2');
652 grid on;
653 xlabel('Frequency (rad/sec)');
654 ylabel('Singular Values (dB)');
655 % % Mu=0.25;
656 % % W2=Mu;
657 %
658 %

```

```

659 M31_nm=0.001; w31_nm=30000; Eps31_nm=0.00001; M32_nm=0.001;
    ↳ w32_nm=30000; Eps32_nm=0.00001;
660 % M31=2; w31=3.1; Eps31=0.01; M32=2; w32=3.1; Eps32=0.01;
661 W3_nm = [tf([1 w31_nm/M31_nm], [Eps31_nm w31_nm]) 0; 0 tf([1
    ↳ w32_nm/M32_nm], [Eps32_nm w32_nm])] ;
662 figure;
663 w=logspace(-3,3,1000);
664 sigma(inv(W3_nm),w)
665 title('Inverse of Weighting matrix W3');
666 grid on;
667 xlabel('Frequency (rad/sec)');
668 ylabel('Singular Values (dB)');
669
670
671 % ****
672 % Generalized plant
673 % Standard weight augmentation using Matlab's augw command
674 % For any non-standard augmentation of weights, form the
    ↳ Generalized plant
675 % manually using state-space methods
676 GenP=augw(P_nm,W1_nm,W2_nm,W3_nm);

677
678 % ****
679 % Obtain controller using Matlab's hinfsyn command
680 % See help on hinfsyn for more options
681 K_nm=hinfsyn(GenP);
682 % ncont = 2;
683 % nmeas = 2;
684 % [K,CL,gamma] = hinfsyn(GenP,nmeas,ncont);
685 % ****
686 % Form closed loop maps
687 % f_CLTFM.m is a matlab function for computing OL and CL maps in
    ↳ a standard
688 % output feedback structure. This file must be in the current
    ↳ Matlab folder
689 [Lo,Li,So,Si,To,Ti,KS,PS] = f_CLTFM(P_nm,K_nm);

690
691 % Can add prefilter if needed
692
693 % PLOTS
694 wvec=logspace(-3,3,10000);

```

```

695
696 figure;
697 sigma(So,wvec);
698 title('Sensitivity using H Infinity for Non-Minimum Phase')
699 grid on;
700 xlabel('Frequency (rad/sec)')
701 ylabel('Singular Values (dB)')

702
703
704
705 figure;
706 sigma(To,wvec);
707 title('Complementary Sensitivity using H Infinity for Non-Minimum
    ↳ Phase')
708 grid on;
709 xlabel('Frequency (rad/sec)')
710 ylabel('Singular Values (dB)')

711
712 figure;
713 sv=sigma(KS,w);
714 tsv=20*log10(sv);
715 semilogx(w,tsv);
716 title('K-Sensitivity (KS) using H-infinity for Non-Minimum
    ↳ Phase');
717 grid on;
718 xlabel('Frequency (rad/sec)');
719 ylabel('Singular Values (dB)');

720
721 figure;
722 step(To);
723 title('Step response using H-infinity for Non-Minimum Phase');
724 grid on;
725 xlabel('Frequency (rad/sec)');
726 ylabel('Magnitude');

727 %INCLUDE THIS IN SAME FOLDER
728 function [Lo,Li,So,Si,To,Ti,KS,SP] = f_CLTFM(P,K)

729
730 % OL and CL frequency responses (ss based)
731 % Works for MIMO P and K
732 % Inputs:

```

```

734 % P: Plant in state space form
735 % K: Control in state space form
736 % Outputs:
737 % Lo, Li: Open loop tfs in ss
738 % So,Si,To,Ti,KS,SP: Closed loop tfs in ss
739
740 [Ap, Bp, Cp, Dp] = ssdata(P);
741 n_e = size(P,1);
742 n_u = size(P,2);
743 n_p = size(P,'order');
744 [Ak, Bk, Ck, Dk] = ssdata(K);
745 n_k = size(K,'order');
746
747 %% Lo = PK
748 A_Lo = [Ap Bp*Ck; zeros(n_k,n_p) Ak];
749 B_Lo = [Bp*Dk; Bk];
750 C_Lo = [Cp Dp*Ck];
751 D_Lo = Dp*Dk;
752 Lo = ss(A_Lo,B_Lo,C_Lo,D_Lo);
753
754 %% Li = KP
755 A_Li = [Ak Bk*Cp; zeros(n_p,n_k) Ap];
756 B_Li = [Bk*Dp; Bp];
757 C_Li = [Ck Dk*Cp];
758 D_Li = Dk*Dp;
759 Li = ss(A_Li,B_Li,C_Li,D_Li);
760
761 %% Mo
762 Mo = inv(eye(n_e)+Dp*Dk);
763 %% Mi
764 Mi = inv(eye(n_u)+Dk*Dp);
765
766 %% So = inv(I+PK)
767 A_So = [Ap-Bp*Dk*Mo*Cp Bp*Ck-Bp*Dk*Mo*Dp*Ck; -Bk*Mo*Cp
768   ↵ Ak-Bk*Mo*Dp*Ck];
769 B_So = [Bp*Dk*Mo; Bk*Mo];
770 C_So = [-Mo*Cp -Mo*Dp*Ck];
771 D_So = Mo;
772 So = ss(A_So,B_So,C_So,D_So);
773 %% Si = inv(I+KP)

```

```

774 A_Si = [Ak-Bk*Dp*Mi*Ck Bk*Dp*Mi*Dk*Cp-Bk*Cp; Bp*Mi*Ck
    ↵ Ap-Bp*Mi*Dk*Cp];
775 B_Si = [-Bk*Dp*Mi; Bp*Mi];
776 C_Si = [Mi*Ck -Mi*Dk*Cp];
777 D_Si = Mi;
778 Si = ss(A_Si,B_Si,C_Si,D_Si);
779
780 %% To = PKinv(I+PK)
781 A_To = [Ap-Bp*Dk*Mo*Cp Bp*Ck-Bp*Dk*Mo*Dp*Ck; -Bk*Mo*Cp
    ↵ Ak-Bk*Mo*Dp*Ck];
782 B_To = [Bp*Dk*Mo; Bk*Mo];
783 C_To = [Mo*Cp Mo*Dp*Ck];
784 D_To = Mo*Dp*Dk;
785 To = ss(A_To,B_To,C_To,D_To);
786
787 %% Ti = inv(I+KP)KP
788 A_Ti = [Ak-Bk*Dp*Mi*Ck Bk*Dp*Mi*Dk*Cp-Bk*Cp; Bp*Mi*Ck
    ↵ Ap-Bp*Mi*Dk*Cp];
789 B_Ti = [-Bk*Dp*Mi; Bp*Mi];
790 C_Ti = [Mi*Ck -Mi*Dk*Cp];
791 D_Ti = -Dk*Dp*Mi;
792 Ti = ss(A_Ti,B_Ti,C_Ti,D_Ti);
793
794 %% KS
795 A_ks = [Ap-Bp*Dk*Mo*Cp Bp*Ck-Bp*Dk*Mo*Dp*Ck; -Bk*Mo*Cp
    ↵ Ak-Bk*Mo*Dp*Ck];
796 B_ks = [Bp*Dk*Mo; Bk*Mo];
797 C_ks = [-Dk*Mo*Cp Ck-Dk*Mo*Dp*Ck];
798 D_ks = Dk*Mo;
799 KS = ss(A_ks,B_ks,C_ks,D_ks);
800
801 %% SP
802 A_sp = [Ak-Bk*Dp*Mi*Ck Bk*Dp*Mi*Dk*Cp-Bk*Cp; Bp*Mi*Ck
    ↵ Ap-Bp*Mi*Dk*Cp];
803 B_sp = [-Bk*Dp*Mi; Bp*Mi];
804 C_sp = [Mo*Dp*Ck Mo*Cp];
805 D_sp = Mo*Dp;
806 SP = ss(A_sp,B_sp,C_sp,D_sp);

```