



**POLITECNICO**  
MILANO 1863

# NETWORKED CONTROL PROJECT

## The Quadruple-Tank Process - 20

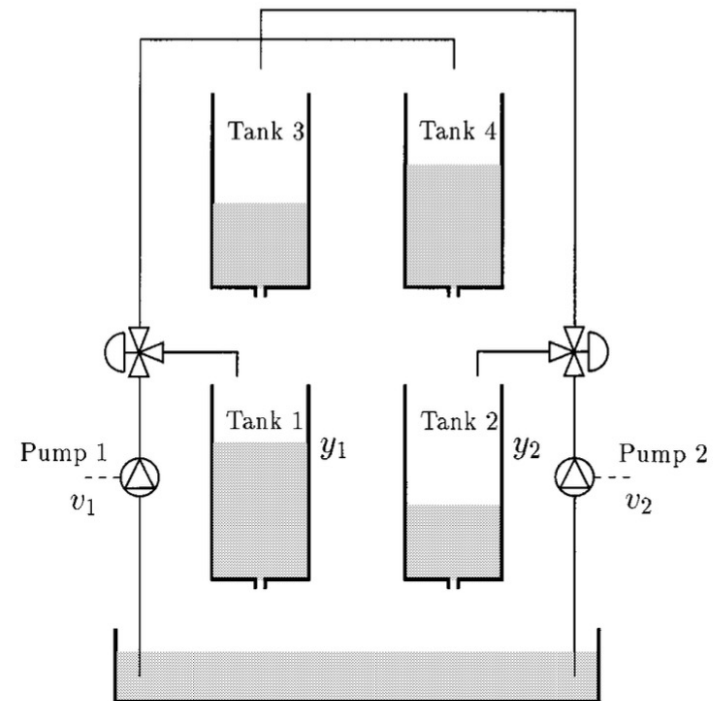
Alessandro Peverali  
Angelo Moroncelli

# System Description

The system under analysis is a laboratory process that consists of four interconnected water tanks.

The target is to control the level of the lower two tanks with two pumps.

- Process inputs:  $v_1$  and  $v_2$  (input voltages to the pumps)
- Process outputs:  $y_1$  and  $y_2$  (voltages from level-measurement devices)



# System Equations

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

$A_1, A_3$	[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.

where

$A_i$  cross-section of Tank  $i$ ;  
 $a_i$  cross-section of the outlet hole;  
 $h_i$  water level.

Continuous Time:

$$\begin{aligned}\dot{x} &= Ax + Bu \\ y &= Cx\end{aligned}$$

# System Operating Conditions

Two possible operating conditions that depend on the configuration of the system parameters are possible. We will analyse the minimum-phase characteristic.

		$P_-$	$P_+$
$(h_1^0, h_2^0)$	[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)

# Subsystem Decomposition

The system can be decomposed in two subsystems, each one corresponding to one of the two tanks attached to the pump plus a connected tank.

Input-decoupled system:

$$\dot{x} = Ax + B_1 u_1 + B_2 u_2$$

$$y_i = C_i x \quad i = 1, 2$$



$$\dot{x} = Ax + [B_1 \ B_2] u$$

$A_{tot} =$

$$\begin{bmatrix} -0.0161 & 0 & 0 & 0.0435 \\ 0 & -0.0333 & 0 & 0 \\ 0 & 0.0333 & -0.0111 & 0 \\ 0 & 0 & 0 & -0.0435 \end{bmatrix}$$

$B =$

$$\begin{bmatrix} 0.0833 & 0 \\ 0.0312 & 0 \\ 0 & 0.0628 \\ 0 & 0.0479 \end{bmatrix}$$

$C =$

$$\begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

$$\begin{bmatrix} y_1 \\ y_2 \end{bmatrix} = \begin{bmatrix} C_1 \\ C_2 \end{bmatrix} x$$

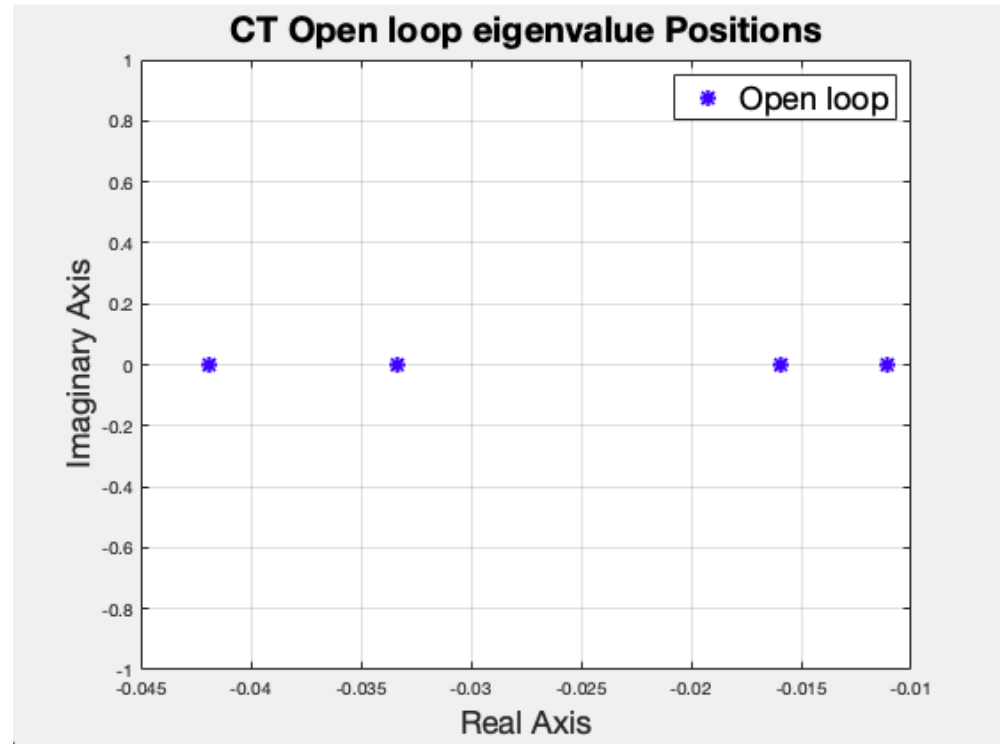


# Open Loop System Analysis

Spectral abscissa = -0.0111



All the eigenvalues of the matrix A are strictly negative, so the open-loop system is **asymptotically stable**.



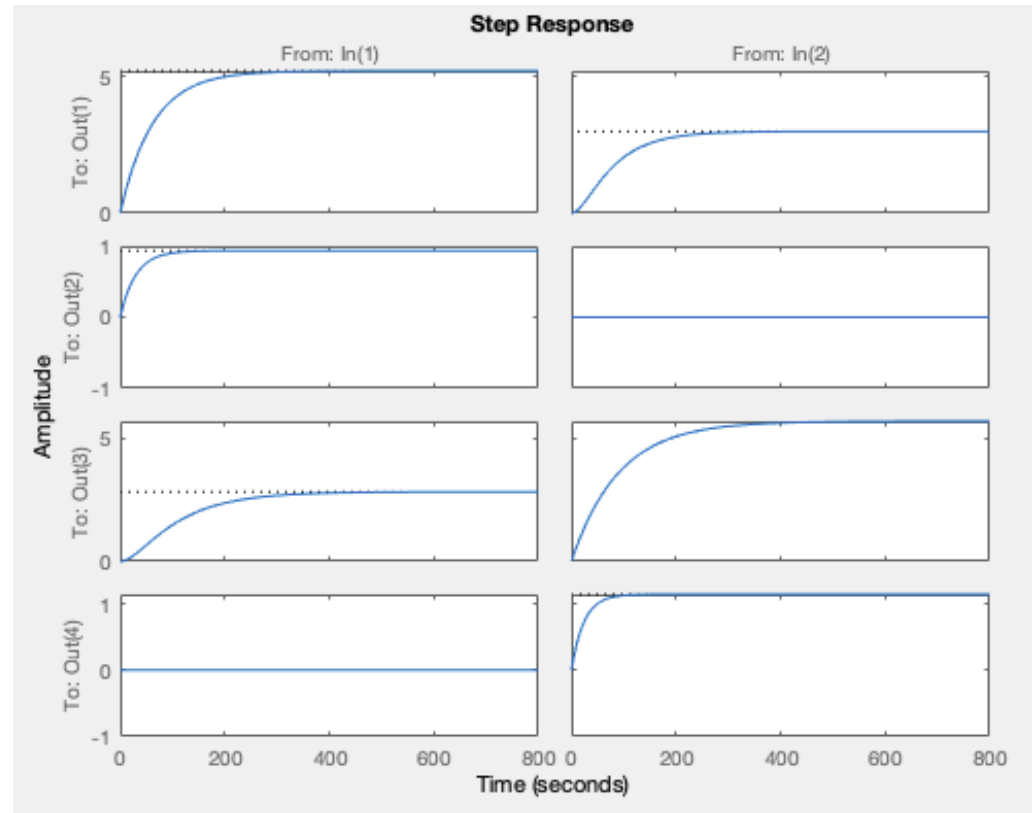
# Open Loop System Analysis

Analysing the step response of the Continuous Time System we can have an idea of the dynamics and have an idea of a suitable sampling time.



$$T_{\text{transient}} = 5/\rho_{\text{CT}}$$

$$T_s = 1$$



# System Discretization

Discretize the system with a sampling time  $T_s=1$  s and with the zero-order holder (ZOH).

Done through the MATLAB command  $d\_system = c2d(system, 1, 'zoh')$

Discrete Time:

$$x_{k+1} = Fx_k + Gu_k$$

$$y_k = Hx_k$$

Ftot =

0.9842	0	0	0.0407
0	0.9672	0	0
0	0.0326	0.9890	0
0	0	0	0.9590

H =

1	0	0	0
0	1	0	0
0	0	1	0
0	0	0	1

G =

0.0826	0.0010
0.0307	0
0.0005	0.0625
0	0.0469

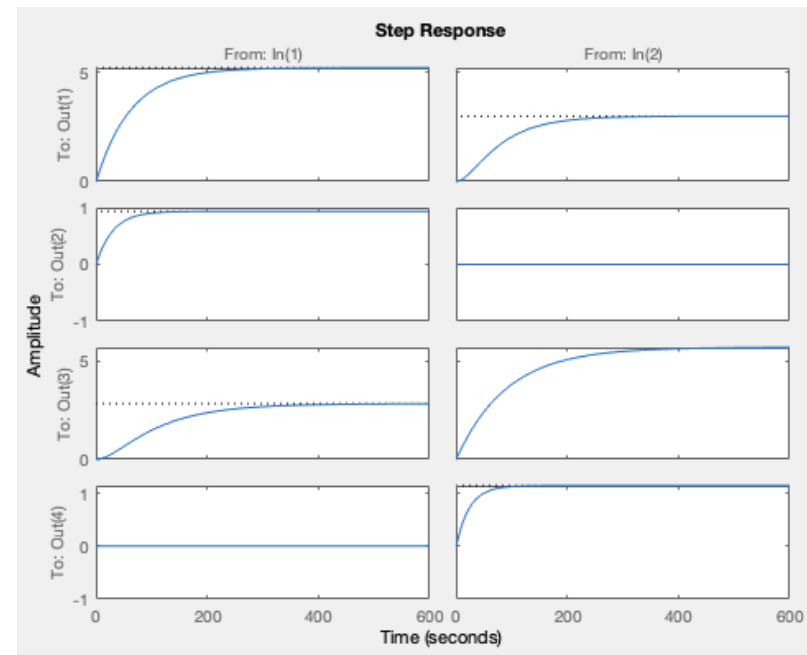
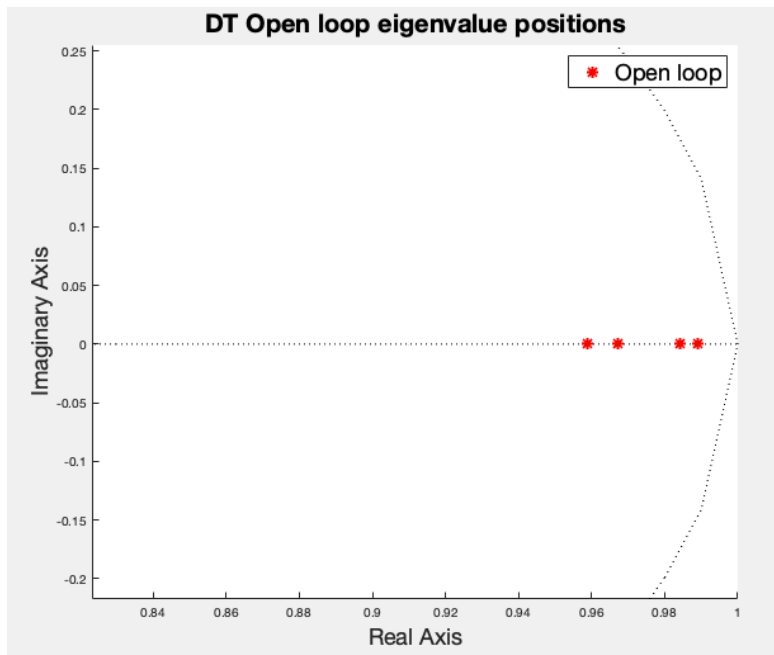


# Open Loop System Analysis

Spectral radius= 0.9890



All the eigenvalues of the matrix  $F$  are strictly inside the unitary circle, so the open-loop system is **asymptotically stable**.



# Controllability and Observability

## Controllability

$$\text{rank}[\lambda_i - A \quad B] = 4 \quad \forall \lambda_i \in \text{eig}(A)$$



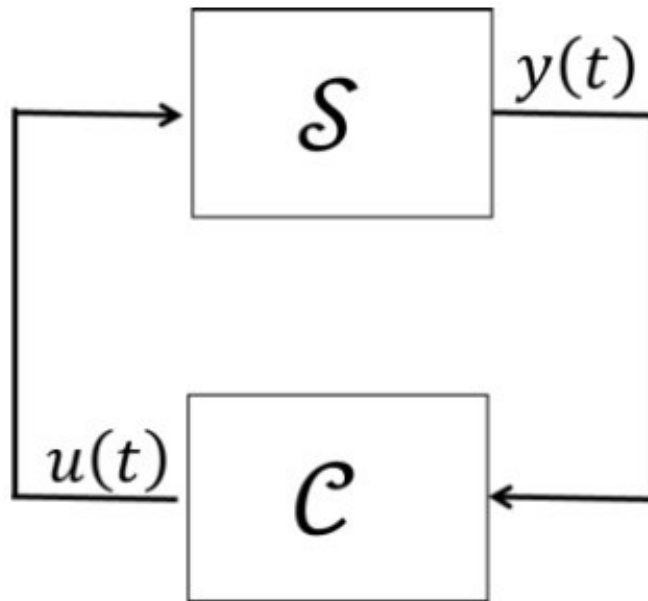
The system is controllable since matrix Co has full rank both in discrete time and continuous time for every eigenvalue

## Observability

$$\text{rank} \begin{bmatrix} \lambda_i - A \\ C \end{bmatrix} = 4 \quad \forall \lambda_i \in \text{eig}(A)$$



The system is observable since matrix Ob has full rank both in discrete time and continuous time for every eigenvalue



# CENTRALIZED CONTROL

# Centralized Control

The idea of the centralized control is to compute a unique regulator that controls the system through a static state-feedback control law because the regulator can access to all the measurements of the system outputs.

The resulting closed loop system will be then  $\dot{x} = (A + BK_x C)x$



$$ContStruc = \begin{bmatrix} 1 & 1 \\ 1 & 1 \end{bmatrix}$$

$$K_c = \begin{bmatrix} K_{11} & K_{12} & K_{13} & K_{14} \\ K_{21} & K_{22} & K_{23} & K_{24} \end{bmatrix}$$

## GOAL

Compute  $K_x$  that makes the closed loop stable by optimizing some LMI

In the centralized case  $K_x$  is a full 2x4 matrix since all the channels have access to the measurements of every other channel.

**Performances are improved by optimizing LMIs!**

# Centralized Control

## Fixed modes and LMI for stability

In order to design a stabilizing gain, it is necessary to check the presence of **fixed modes**. It can be done through an iterative approach represented by the *di\_fixed\_modes* function.

**In our system there are no continuous time  
nor discrete time centralized fixed modes.**



We can obtain a control law that stabilize the system by optimizing the LMI for stability

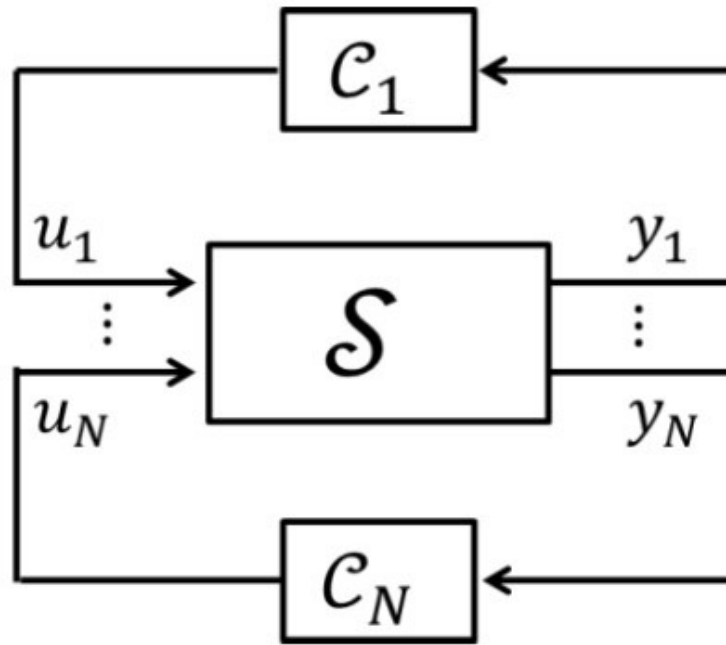
*Theorem*

$\exists K: A + BK$  is Hurwitz stable  $\leftrightarrow \exists P = P^T > 0 : (A + BK)^T P + P(A + BK) < 0$ .

Renaming  $Y = P^{-1}$  and  $L = KY$ , we obtain:

**LMI for stability**

$$\begin{cases} Y > 0 \\ YA^T + AY + L^T B + BL < 0 \end{cases}$$



# DECENTRALIZED CONTROL



# Decentralized Control

The idea of a decentralized control is to compute multiple independent regulator, one for every channel  $i$ , where each of them controls the system only through  $y_i$  and  $u_i$

The resulting closed loop system is, also in this case  $\dot{x} = (A + BK)x$ .



## GOAL

Compute  $K$  that makes the closed loop stable by optimizing some LMI

$$ContStruc = \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix}$$

In the decentralized case  $K_x$  is a block-diagonal matrix, where on the diagonals there are full-matrices of dimension  $n_{u_i} \times n_{y_i}$  for every channel  $i$

$$K_c = \begin{bmatrix} K_{11} & K_{12} & 0 & 0 \\ 0 & 0 & K_{23} & K_{24} \end{bmatrix}$$

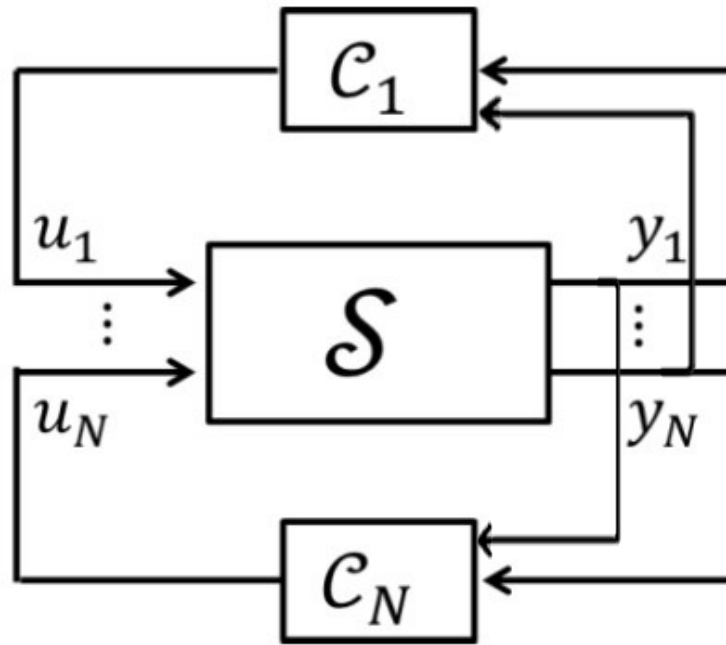
# Decentralized Control

## Continuous Stabilizing Control Law

The procedure followed is the same of the centralized case, but with a different structure of matrix  $K$ .

**In our system there are no continuous time nor discrete time decentralized fixed modes.**

The LMI for stabilization are the one used in the centralized case, with the difference that in the decentralized case is not possible to arbitrarily place the closed-loop eigenvalues with an output-feedback static control law, neither with a state-feedback static control law.



# DISTRIBUTED CONTROL

# Distributed Control

The idea is again to obtain a static static-feedback control law, resulting in the closed loop system  $\dot{x} = (A + BK C)x$



$$ContStruc = \begin{bmatrix} 1 & 0 \\ 1 & 1 \end{bmatrix}$$

$$ContStruc = \begin{bmatrix} 1 & 1 \\ 0 & 1 \end{bmatrix}$$

## GOAL

Compute K that makes the closed loop stable by optimizing some LMI

Also in the distributed case is not possible to arbitrarily place the closed-loop eigenvalues with an output-feedback static control law, neither with a state-feedback static control law.

The structure of the matrix  $K_{distrib}$  is sparse and changes according to the configuration considered. In particular  $K_{distrib}$  will have a zero matrix corresponding to the block (i,j) when output j is not available to controller Ci.

# Design of Static Control Laws using LMIs

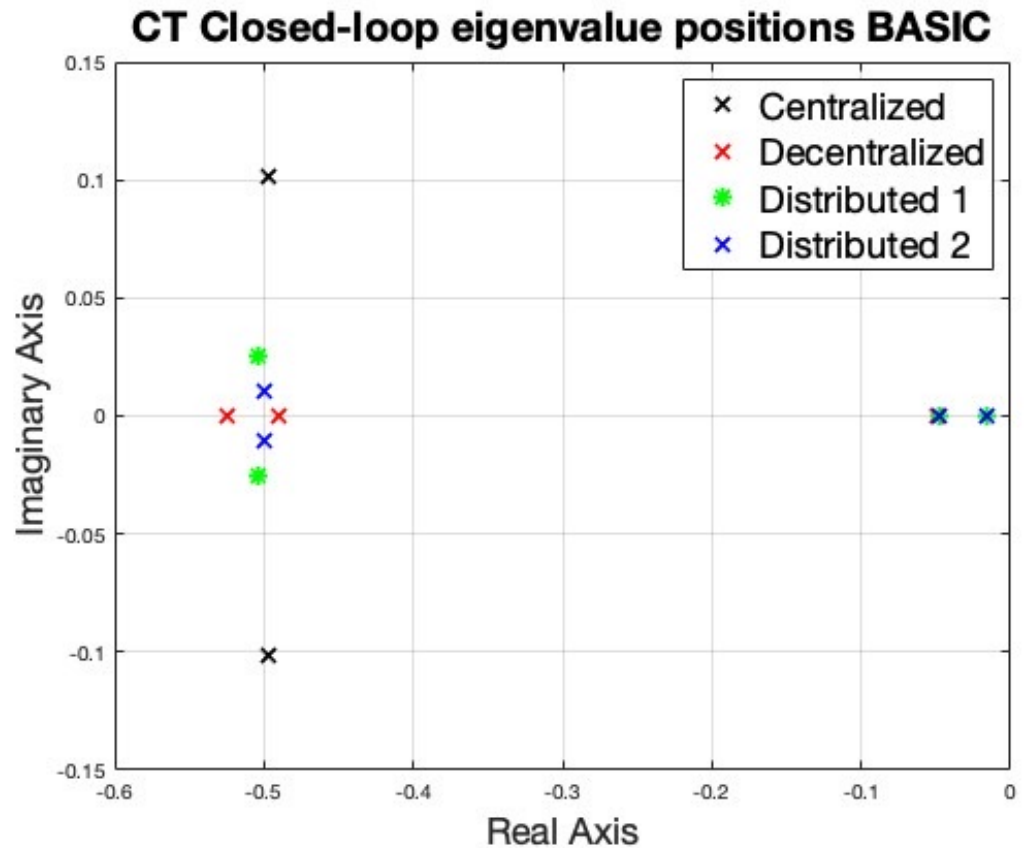
We considered different LMIs problems for both continuous time and discrete time systems:

- Basic Controller for Asymptotic Stability
- Reduction of the Control Effort
- Limitation on the Spectral Abscissa of  $A + BK_x$  *(Continuous – Time)*
- Limitation on the Spectral Radius of  $A + BK_x$  *(Discrete – Time)*
- Eigenvalues of  $A + BK_x$  in a disk *(Continuous – Time)*

# Basic Controller for Asymptotic Stability

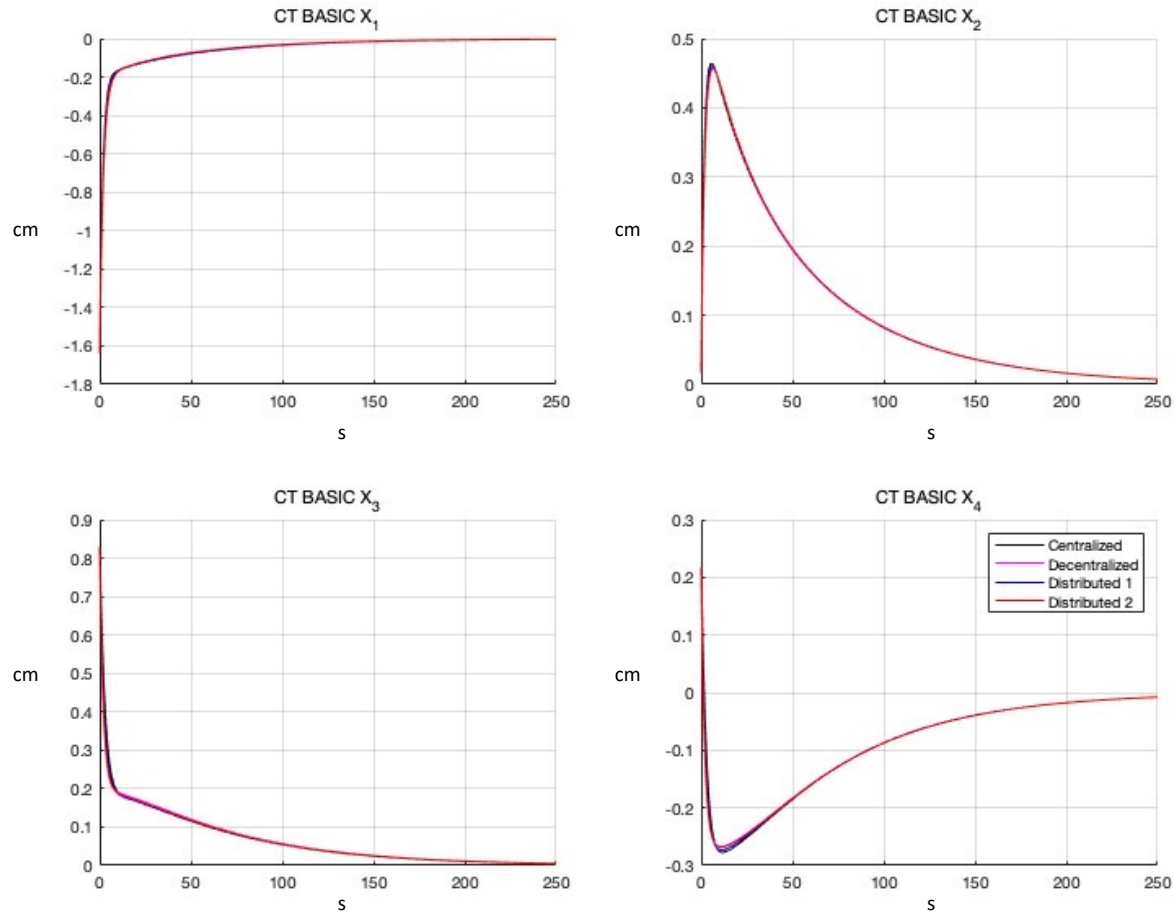
- Continuous-Time

$$YA^T + AY + L^T B^T + BL < 0$$
$$Y > 0$$





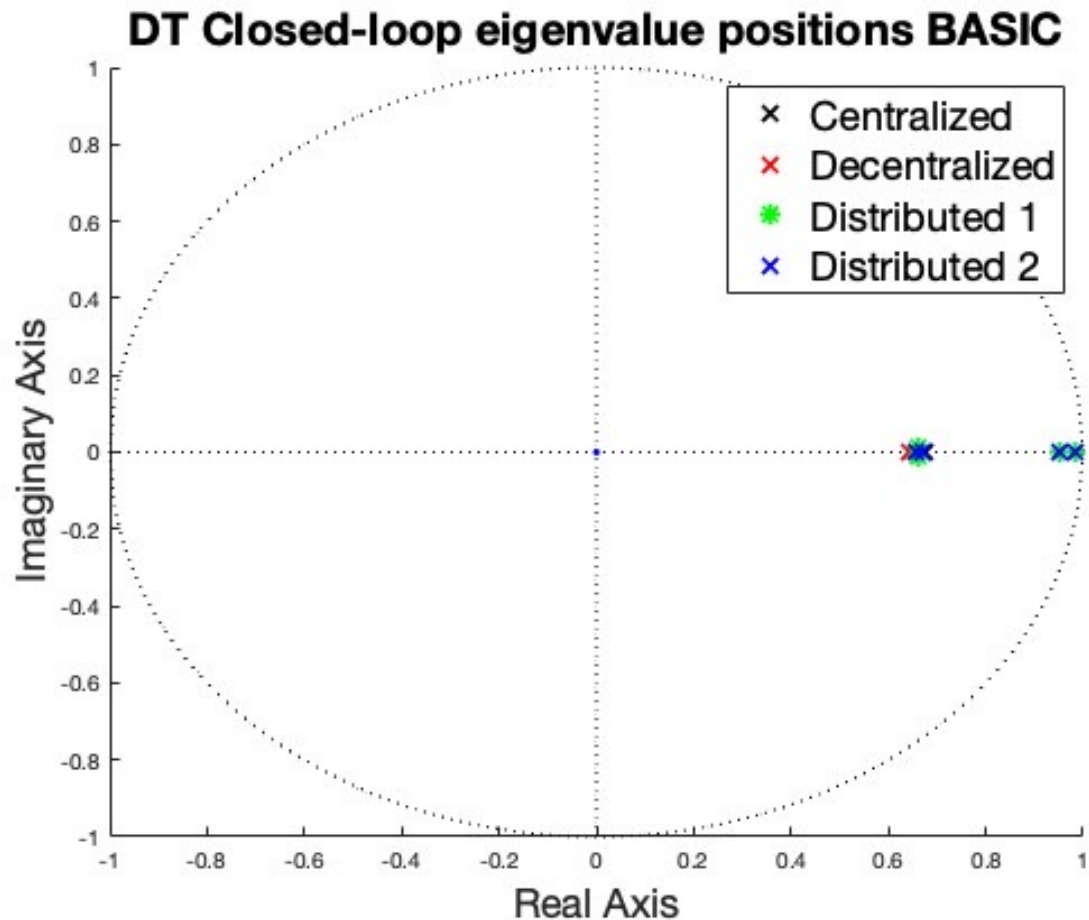
# Basic Controller for Asymptotic Stability



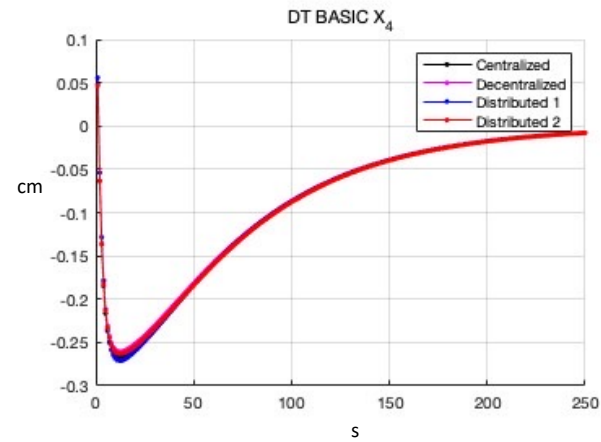
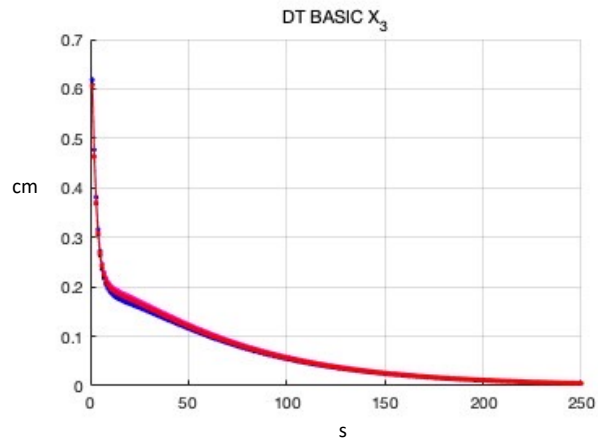
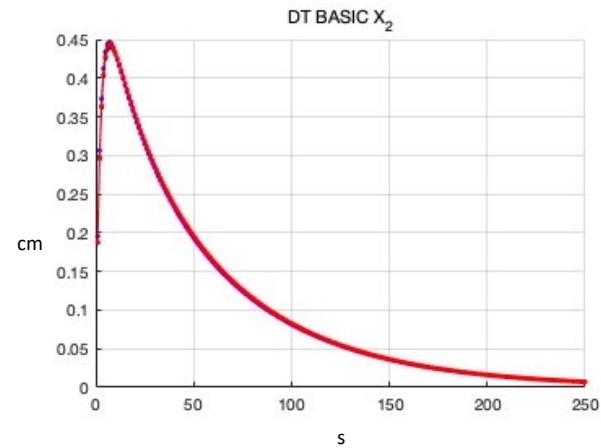
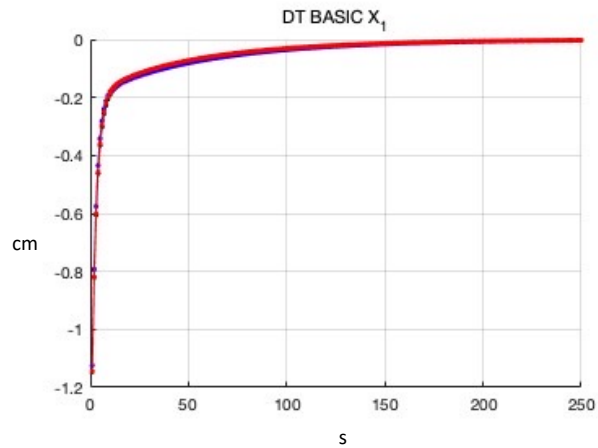
# Basic Controller for Asymptotic Stability

- Discrete-Time

$$\begin{bmatrix} P - FPF^T - FL^TG^T - GLF^T & GL \\ L^TG^T & P \end{bmatrix} > 0$$



# Basic Controller for Asymptotic Stability



# Reduction of the Control Effort

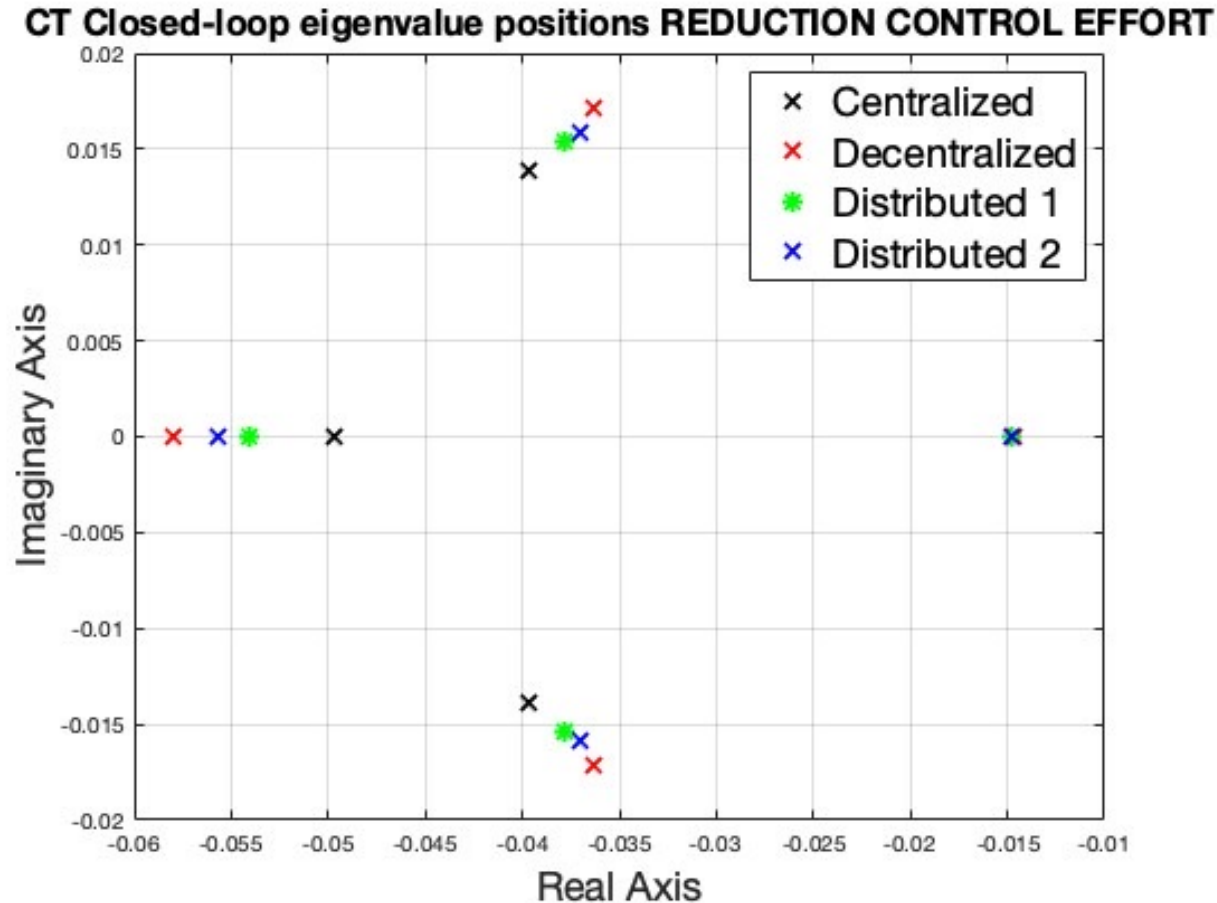
○ Continuous-Time

- **L minimization**

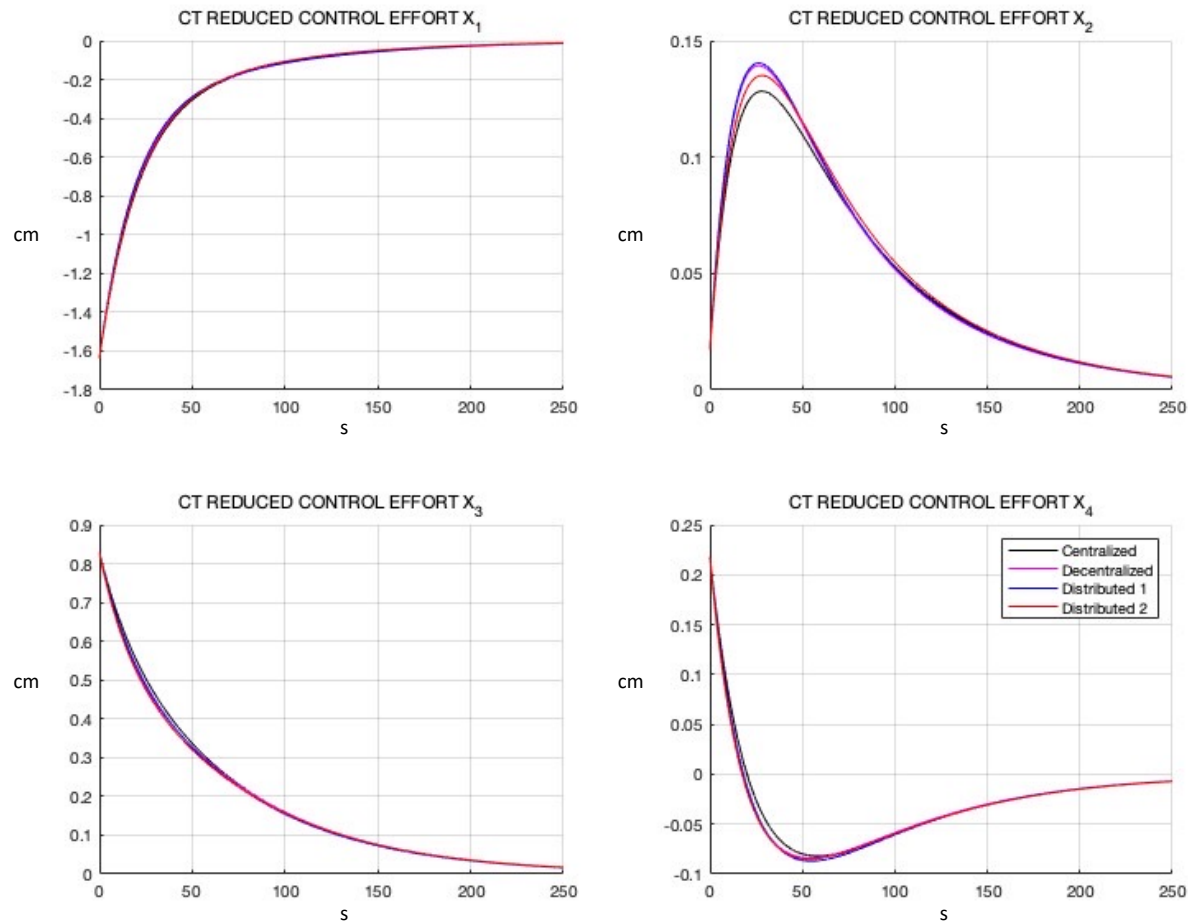
$$\begin{bmatrix} \kappa_L I & L^T \\ L & I \end{bmatrix} \geq 0$$

- **Y minimization**

$$\begin{bmatrix} \kappa_Y I & I \\ I & Y \end{bmatrix} \geq 0$$

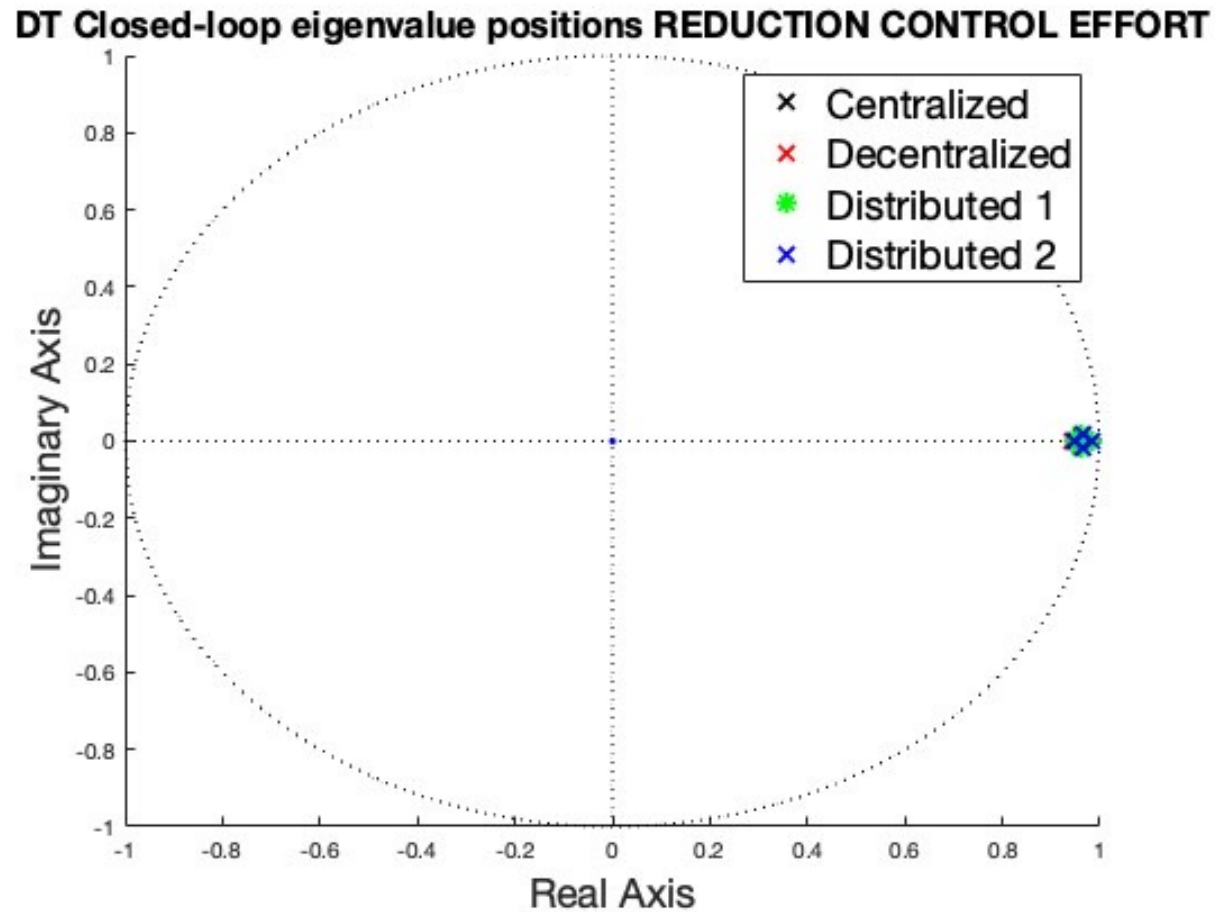


# Reduction of the Control Effort



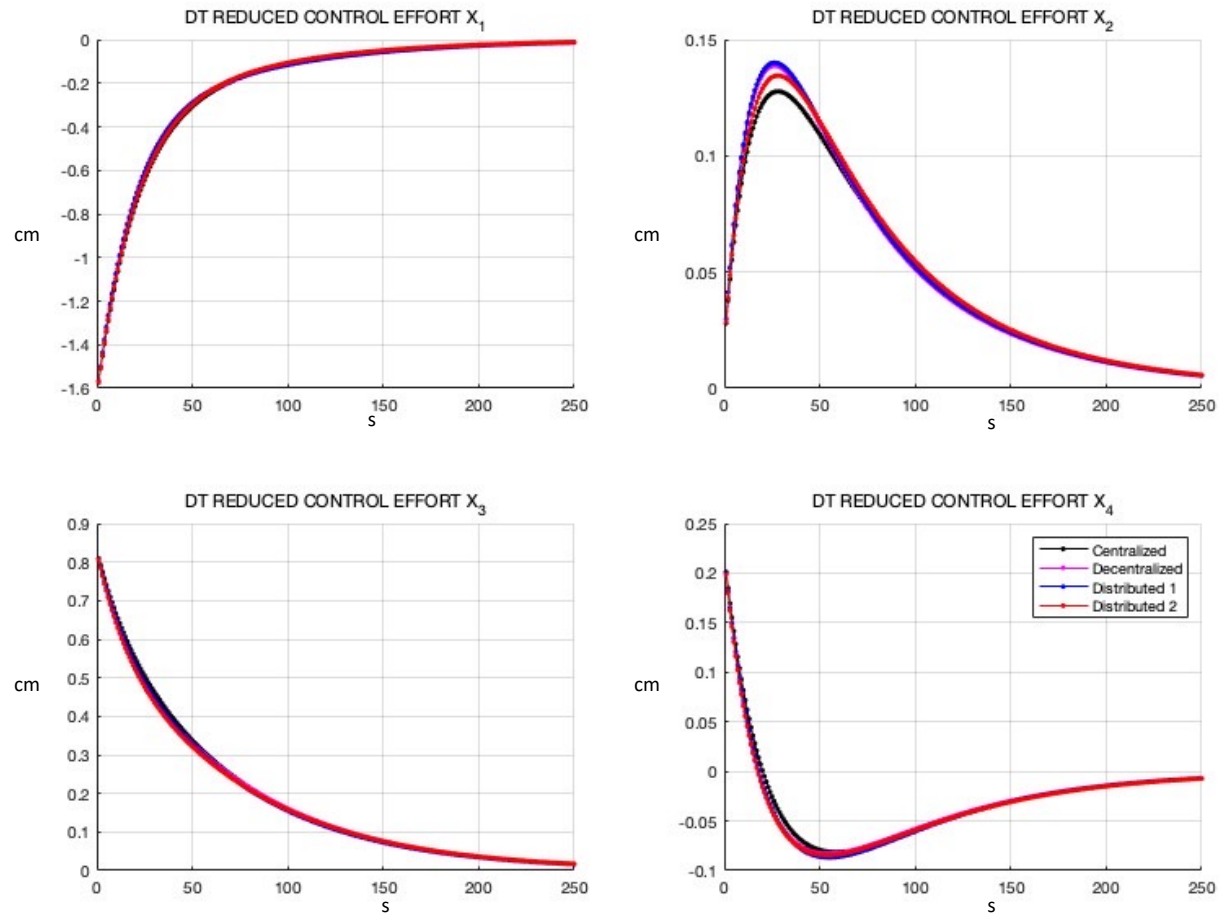
# Reduction of the Control Effort

- Discrete-Time





# Reduction of the Control Effort

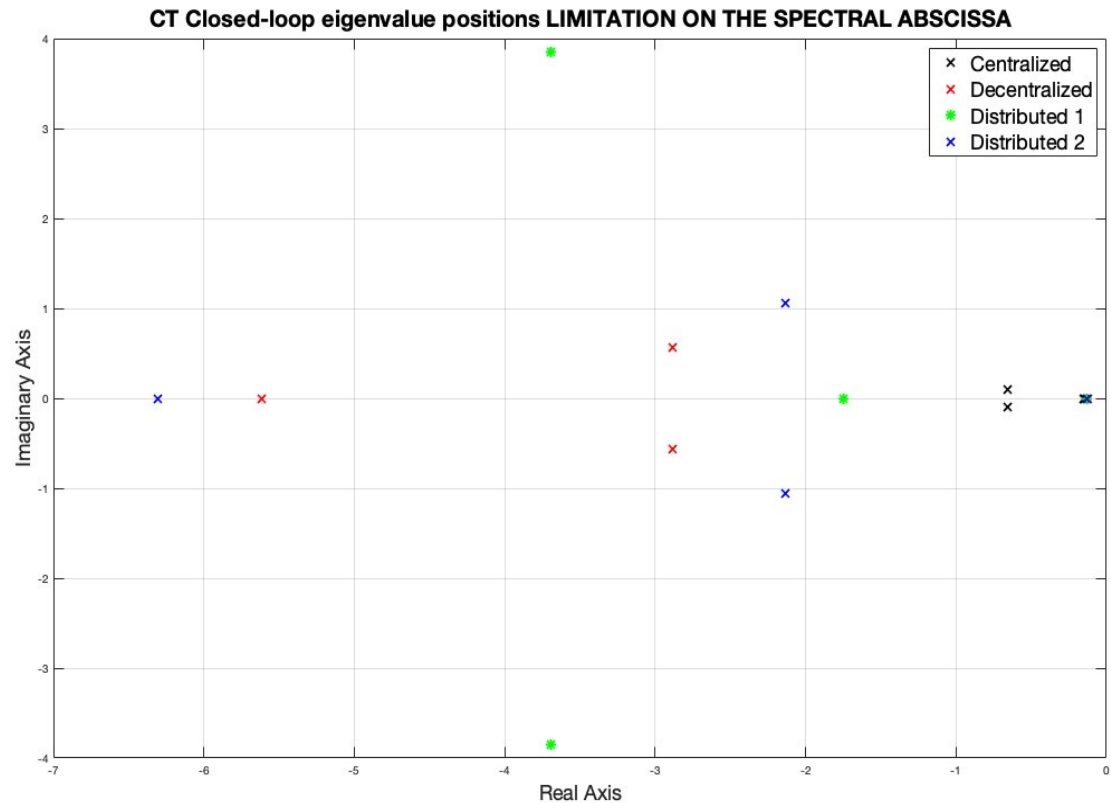


# Limitation on the Spectral Abscissa of $A + BK_x$

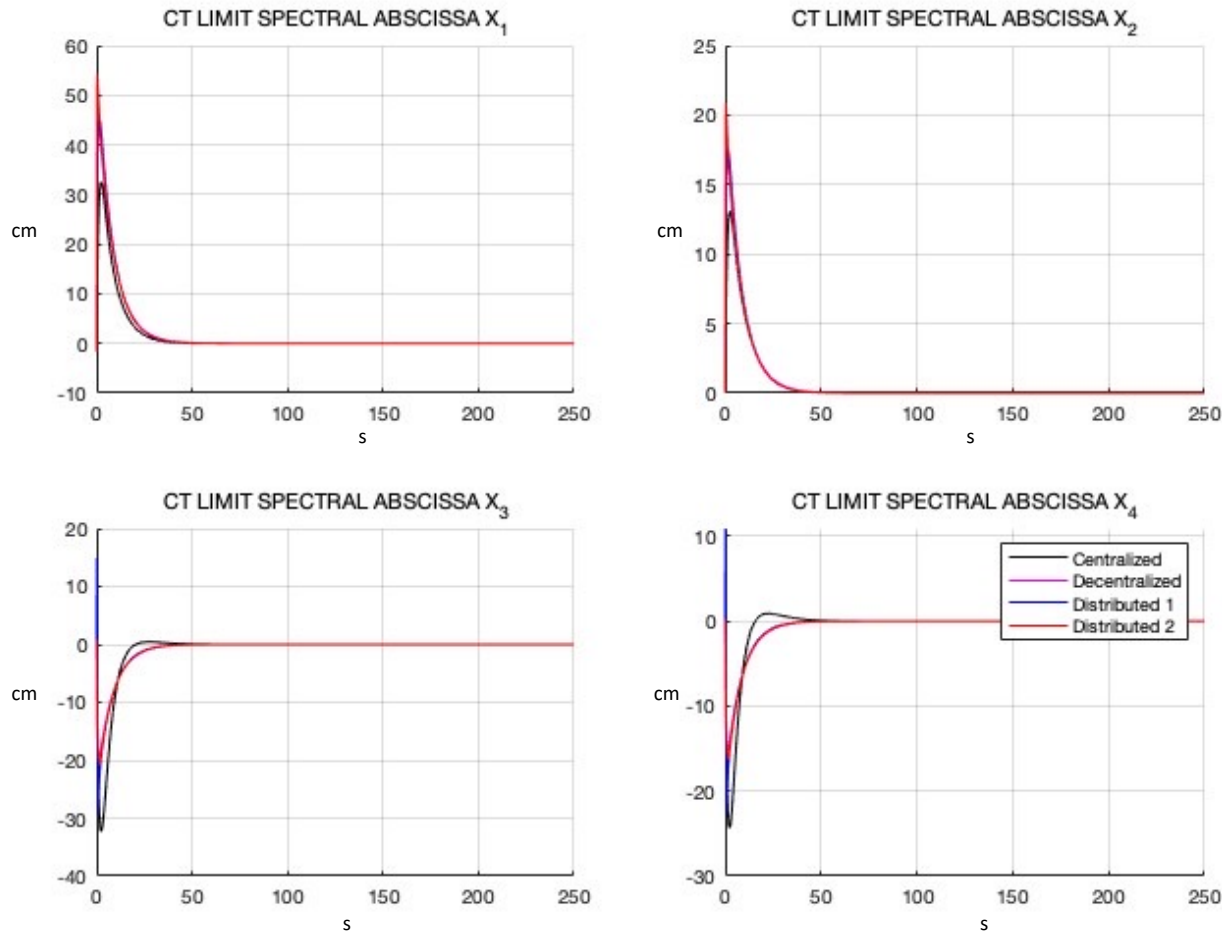
- Continuous-Time

$$YA^T + AY + L^T B^T + BL + 2\alpha Y < 0$$

- Parameter:  $\alpha = 0.1$



# Limitation on the Spectral Abscissa of $A + BK_x$

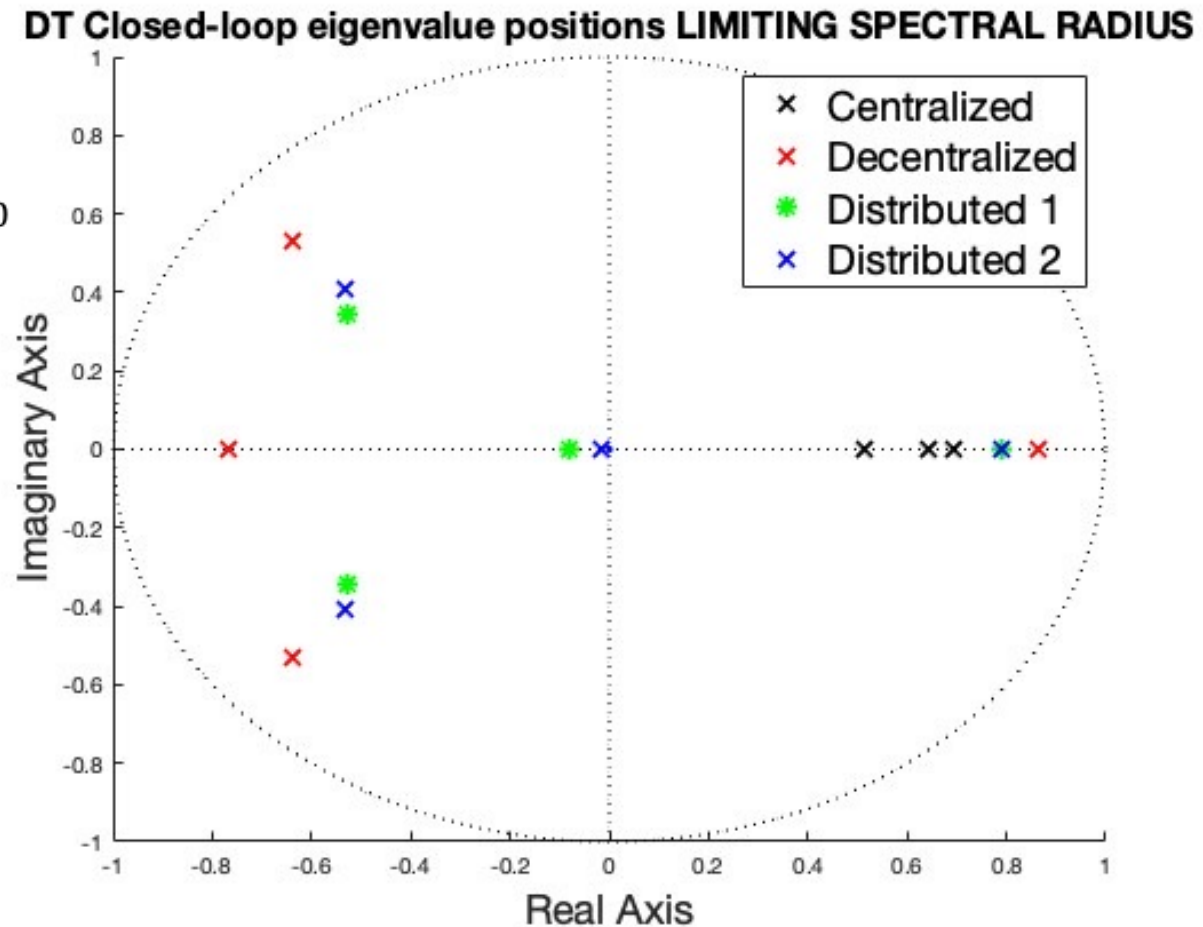


# Limitation on the Spectral Radius of $A + BK_x$

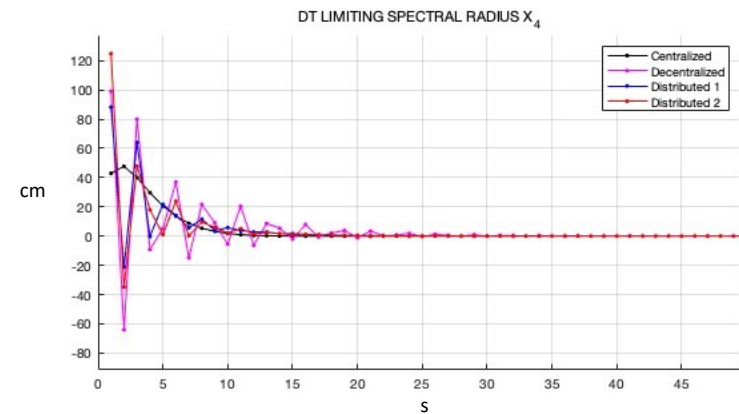
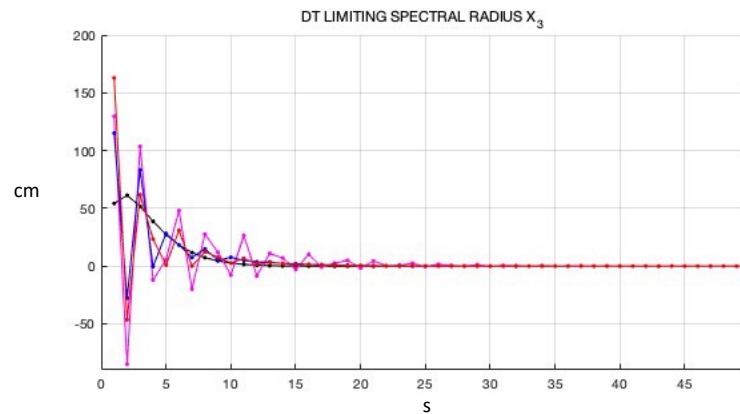
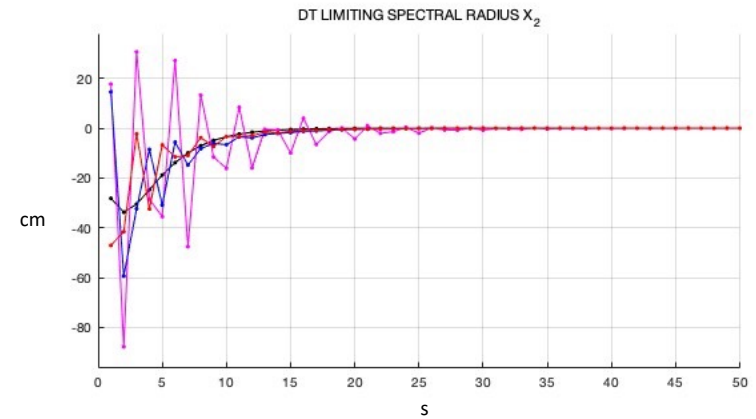
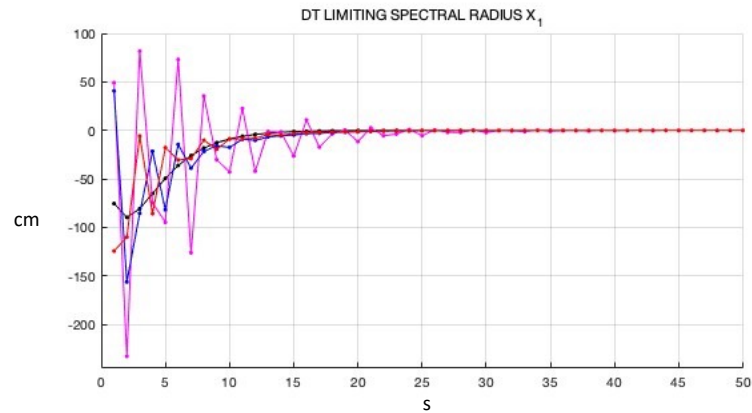
- Discrete-Time

$$\begin{bmatrix} \rho^2 P - APA^T - AL^T B^T - BLA^T & BL \\ L^T B^T & P \end{bmatrix} > 0$$

- Parameter:  $\rho = 0.8$



# Limitation on the Spectral Radius of $A + BK_x$

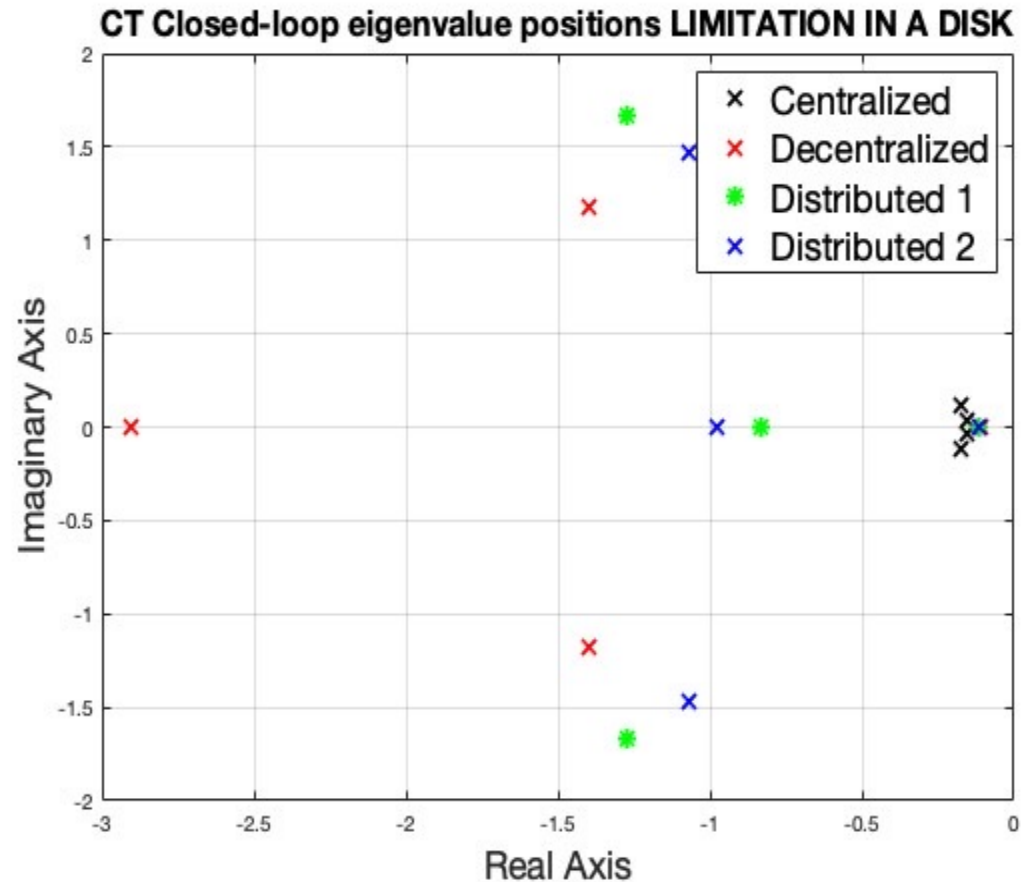


# Eigenvalues of $A + BK_x$ in a disk

## ○ Continuous-Time

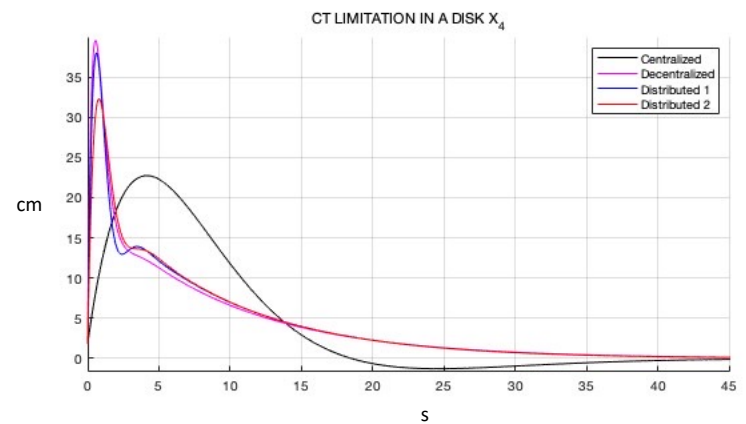
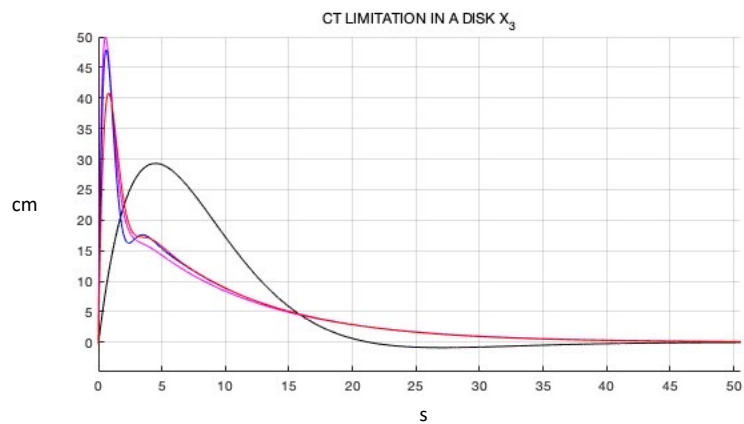
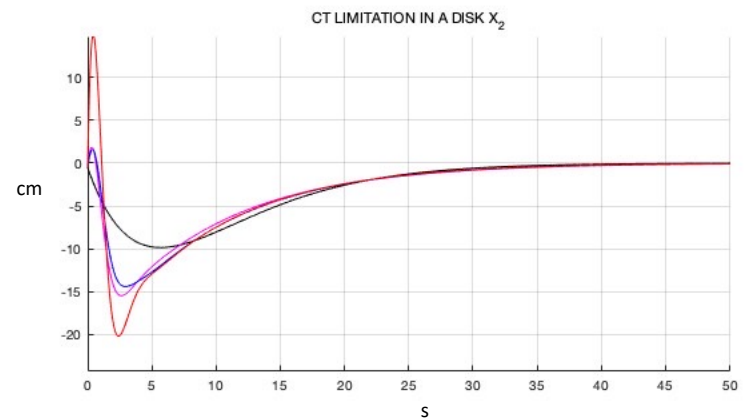
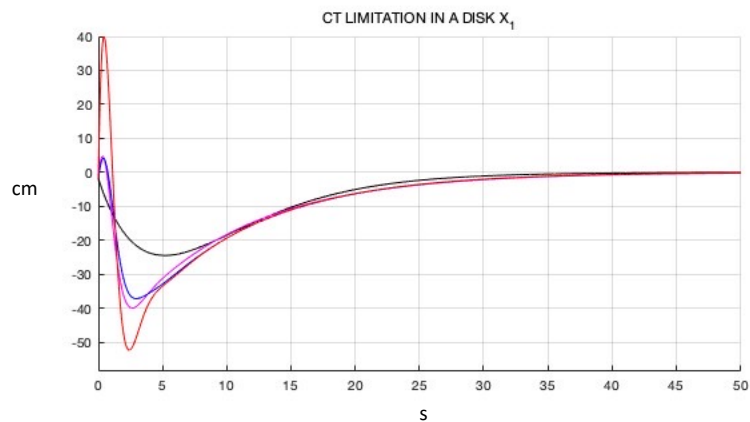
$$\begin{bmatrix} (\rho^2 - \alpha^2)P - APA^T - AL^TB^T - BLA^T - \alpha(PA^T + AP + L^TB^T + BL) & BL \\ L^TB^T & P \end{bmatrix} > 0$$

- Parameter:  $\alpha = 6$   
 $\rho = 0.8$





# Eigenvalues of $A + BK_x$ in a disk



# Summary

## Results STABLE CONTROLLER (Continuous-time):

Scegli visualizzazione barra laterale .ty=0, rho=0.50759, FM=.

- Decentralized: Feasibility=0, rho=0.52429, FM=.
- Distributed1 (u2-x1): Feasibility=0, rho=0.50443, FM=.
- Distributed2 (u1-x2): Feasibility=0, rho=0.49984, FM=.

## Results STABLE CONTROLLER (Discrete-time):

- Centralized: Feasibility=0, rho=0.98396, FM=.
- Decentralized: Feasibility=0, rho=0.98401, FM=.
- Distributed (u2-x1): Feasibility=0, rho=0.98397, FM=.
- Distributed (u1-x2): Feasibility=0, rho=0.98398, FM=.

## Results REDUCTION OF THE CONTROL EFFORT (Continuous-time):

- Centralized: Feasibility=0, rho=-0.014738, FM=.
- Decentralized: Feasibility=0, rho=-0.014721, FM=.
- Distributed (u2-x1): Feasibility=0, rho=-0.014789, FM=.
- Distributed (u1-x2): Feasibility=0, rho=-0.014736, FM=.

## Results REDUCTION OF THE CONTROL EFFORT (Discrete-time):

- Centralized: Feasibility=0, rho=0.98538, FM=.
- Decentralized: Feasibility=0, rho=0.9854, FM=.
- Distributed (u2-x1): Feasibility=0, rho=0.98532, FM=.
- Distributed (u1-x2): Feasibility=0, rho=0.98539, FM=.

# Summary

Results LIMITATION ON THE SPECTRAL ABSCISSA (Continuous-time):

- Centralized: Feasibility=0,  $\rho=-0.14129$ , FM=.
- Decentralized: Feasibility=0,  $\rho=-0.12053$ , FM=.
- Distributed (u2-x1): Feasibility=0,  $\rho=-0.12937$ , FM=.
- Distributed (u1-x2): Feasibility=0,  $\rho=-0.1273$ , FM=.

Results LIMITATION ON THE SPECTRAL RADIUS (Discrete-time):

- Centralized: Feasibility=0,  $\rho=0.69379$ , FM=.
- Decentralized: Feasibility=0,  $\rho=0.86396$ , FM=.
- Distributed (u2-x1): Feasibility=0,  $\rho=0.79106$ , FM=.
- Distributed (u1-x2): Feasibility=0,  $\rho=0.78894$ , FM=.

Results EIGENVALUES IN A DISK (Continuous-time):

- Centralized: Feasibility=0,  $\rho=-0.15009$ , FM=.
- Decentralized: Feasibility=0,  $\rho=-0.10686$ , FM=.
- Distributed (u2-x1): Feasibility=0,  $\rho=-0.11179$ , FM=.
- Distributed (u1-x2): Feasibility=0,  $\rho=-0.11301$ , FM=.