





## Control System Synthesis - Robust control PHD CLASS - FALL 2020



- Where does uncertainty come from?
- Modelling uncertainty
- Robustness
- Small gain theorem
- Robust stability
- Robust performance

### Robust synthesis

 $\mathcal{H}_\infty$  -synthesis  $\mathcal{H}_\infty$  -Loopshaping synthesis  $\mu$  -analysis and synthesis

### 1 Introduction

- 2 Fundamentals
- 3 Design techniques
  - PID control
  - Optimal control and LQG



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### 1 Introduction

- 2 Fundamentals
- 3 Design techniques
  - PID control
  - Optimal control and LQG
  - Robust control and Hinf synthesis
  - Model Predictive Control
  - Adaptive Control
  - Data-driven Control

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## Content overview

## Uncertainty and robustness

- Where does uncertainty come from?
- Modelling uncertainty
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## 2 Robust synthesis

- $\mathcal{H}_{\infty}$ -synthesis
- **\blacksquare**  $\mathcal{H}_{\infty}$ -Loopshaping synthesis
- $\mu$ -analysis and synthesis

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## Uncertainty and robustness

Where does uncertainty come from?

A model is only an approximation of the reality!

Complex dynamics

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## Uncertainty and robustness

Where does uncertainty come from?

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- Complex dynamics
- Uncertain inputs
- Simplified models

## **Uncertainty and**

- Where does uncertainty come from?

- Small gain theorem

 $\mathcal{H}_{\infty}$  -synthesis

## Uncertainty and robustness

Where does uncertainty come from?

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- Complex dynamics
- Uncertain inputs
- Simplified models
- Process variations





Control System Synthesis

## **Uncertainty and**

- Where does uncertainty come from?

 $\mathcal{H}_{\infty}$  -synthesis

## Uncertainty and robustness

Where does uncertainty come from?

A model is only an approximation of the reality!

- Complex dynamics
- Uncertain inputs
- Simplified models
- Process variations

The controller is tailored for the model

- Is your controller good enough for the real system?  $\rightarrow$  **analysis**
- Can you take into account the uncertainties during the design?  $\rightarrow$  synthesis



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## Uncertainty and robustness

Modelling uncertainty

## Uncertainty and robustness

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## How to handle uncertainty?

Classical margins requirements

- Gain margin  $g_m > 5$ dB
- Phase margin  $\varphi_m > 45^\circ$



### Modelling uncertainty

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### Limitations of classical margins





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## Uncertainty and robustness Modelling uncertainty

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### Less structured representations of uncertainty

 $\rightarrow$  set of transfer functions around the nominal model

Modelling uncertainty

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## Less structured representations of uncertainty

 $\rightarrow$  set of transfer functions around the nominal model

### Additive uncertainty

$$P_{\Delta}(s) = P(s) + W_1(s)\Delta(s)W_2(s), \ \forall \omega > 0 \ \overline{\sigma}(\Delta(\jmath \omega)) < 1$$

 $W_1$  and  $W_2$ : spatial and frequency structure of the uncertainty



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Modelling uncertainty

## Uncertainty and robustness

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### Less structured representations of uncertainty

 $\rightarrow$  set of transfer functions around the nominal model

### **Multiplicative uncertainty**

 $P_{\Delta}(s) = (I + W_1(s)\Delta(s)W_2(s))P(s), \ \forall \omega > 0 \ \overline{\sigma}(\Delta(\jmath \omega)) < 1$ 



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Robustness

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## **Definition of robustness**



Robustness

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## **Definition of robustness**

- Nominal stability:  $S = (I + PC)^1$  stable
- Nominal performance:  $\overline{\sigma}(S) \leq 1/|W_p|$



Robustness

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## **Definition of robustness**

- Nominal stability:  $S = (I + PC)^1$  stable
- Nominal performance:  $\overline{\sigma}(S) \leq 1/|W_p|$
- Robust stability:  $S_{\delta} = (I + P_{\delta}C)^1$  stable,  $\forall P_{\delta} \in \mathcal{P}$



Robustness

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- Robust stability:  $S_{\delta} = (I + P_{\delta}C)^1$  stable,  $\forall P_{\delta} \in P$
- Robust performance:  $\overline{\sigma}(\mathcal{S}_{\delta}) \leq 1/|W\!p|, \forall P_{\delta} \in \mathcal{P}$

and model uncertainty

Definition of robustness

Ability to meet requirements (stability and performances) under disturbance



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## Uncertainty and robustness

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### How to analyze/enforce robust stability and performance?

Definition of robustness

### Small gain theorem

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### Small-gain theorem

Suppose  $M \in \mathcal{RH}_{\infty}$  and let  $\gamma > 0$ . Then this interconnected system is well-posed and internally stable for all  $\Delta(s) \in \mathcal{RH}_{\infty}$  with:

$$\| \Delta \|_{\infty} \leq rac{1}{\gamma}$$
 if and only if  $\| M \|_{\infty} < \gamma$ 

 $\blacksquare \ \|\Delta\|_{\infty} < \frac{1}{\gamma} \text{ if and only if } \|M\|_{\infty} \le \gamma$ 

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$$P_{\Delta}(s) = P(s) + W_1(s)\Delta(s)W_2(s), \ orall \omega > 0 \ \overline{\sigma}(\Delta(\jmath\omega)) < 1$$



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$$extsf{P}_{\Delta}(s) = extsf{P}(s) + extsf{W}_1(s)\Delta(s) extsf{W}_2(s), \ orall \omega > 0 \ \overline{\sigma}(\Delta(\jmath\omega)) < 1$$



The closed-loop is internally stable for  $\Delta \in \mathcal{RH}_{\infty}$  such that  $\|\Delta\|_{\infty} < 1$  if and only if  $\|M\|_{\infty} \leq 1$ 

$$M = W_2 K (I + KP)^{-1} W_1$$

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$W_1 \in \mathcal{RH}_{\infty} \ W_2 \in \mathcal{RH}_{\infty} \ \Delta \in \mathcal{RH}_{\infty} \ \ \Delta\ _{\infty} < 1$		
Perturbed Model Sets	Representative Types of Uncertainty Characterized	Robust Stability Tests
$(I+W_1\Delta W_2)P$	output (sensor) errors neglected HF dynamics uncertain rhp zeros	$\left\ W_2T_oW_1\right\ _\infty\leq 1$
$P(I + W_1 \Delta W_2)$	input (actuators) errors neglected HF dynamics uncertain rhp zeros	$\ W_2T_iW_1\ _\infty \leq 1$
$(I+W_1\Delta W_2)^{-1}P$	LF parameter errors uncertain rhp poles	$\left\ W_2S_oW_1\right\ _\infty\leq 1$
$P(I + W_1 \Delta W_2)^{-1}$	LF parameter errors uncertain rhp poles	$\ W_2S_iW_1\ _\infty \leq 1$
$P + W_1 \Delta W_2$	additive plant errors neglected HF dynamics uncertain rhp zeros	$\left\ W_2KS_oW_1\right\ _{\infty} \leq 1$
$P(I+W_1\Delta W_2P)^{-1}$	LF parameter errors uncertain rhp poles	$\left\ W_2S_oPW_1\right\ _\infty \leq 1$
$(\tilde{M} + \tilde{\Delta}_M)^{-1}(\tilde{N} + \tilde{\Delta}_N)$ $P = \tilde{M}^{-1}\tilde{N}$ $\Delta = \begin{bmatrix} \tilde{\Delta}_N & \tilde{\Delta}_M \end{bmatrix}$	LF parameter errors neglected HF dynamics uncertain rhp poles & zeros	$\left\  \begin{bmatrix} K \\ I \end{bmatrix} S_o \tilde{M}^{-1} \right\ _{\infty} \leq 1$
$ \begin{array}{c} (N + \Delta_N)(M + \Delta_M)^{-1} \\ P = NM^{-1} \\ \Delta = \begin{bmatrix} \Delta_N \\ \Delta_M \end{bmatrix} \end{array} $	LF parameter errors neglected HF dynamics uncertain rhp poles & zeros	$\left\ M^{-1}S_i[K\ I]\right\ _\infty \leq 1$

## Essentials of robust control Zhou, K., Doyle, J. C. (1998).

Table 8.1: Unstructured robust stability tests (HF: high frequency, LF: low frequency)

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### Robust performance

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robust stability and  $\sup_{\|\tilde{\delta}\|_2 \leq 1} \|\boldsymbol{e}\|_2 \leq 1$ 

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robust stability and  $\|T_{\tilde{\delta}e}\|_{\infty} \leq 1, \ \forall \Delta \in \mathcal{RH}_{\infty}, \|\Delta\|_{\infty} < 1$  $T_{\tilde{\delta}e} = W_{e}(I + P_{\Delta}K)^{-1}W_{d} \text{ with } P_{\Delta} \in \Pi$ 

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## Uncertainty and robustness Robust performance

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Sufficient condition in the case of multiplicative uncertainty:

$$orall \omega, \ \overline{\sigma}(W_d)\overline{\sigma}(W_eS) + \overline{\sigma}(W_1)\overline{\sigma}(W_2T) \le 1$$
  
 $S = (I + KP)^{-1}, \ T = I - S$ 

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## Uncertainty and robustness Summary

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- Requires to represent uncertainty
  - Margins



# Uncertainty and robustness <sub>Summary</sub>

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  - Model set for the system's transfer function



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## The goal of robust control is to address uncertainty

- Requires to represent uncertainty
  - Margins
  - Model set for the system's transfer function
- Small-gain theorem ightarrow Robust stability test



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  - Model set for the system's transfer function
- Small-gain theorem ightarrow Robust stability test
- Additional sufficient conditions for robust performance
# Uncertainty and robustness

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## 2 Robust synthesis

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- **\blacksquare**  $\mathcal{H}_{\infty}$ -Loopshaping synthesis
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# Robust synthesis $\mathcal{H}_{\infty}$ -synthesis

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**Optimal**  $\mathcal{H}_{\infty}$  **Control**: Find all admissible controllers K(s) such that  $||T_{z\omega}||_{\infty}$  is minimized.

# Robust synthesis $\mathcal{H}_{\infty}$ -synthesis

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- Optimal  $\mathcal{H}_{\infty}$  Control: Find all admissible controllers K(s) such that  $||T_{z\omega}||_{\infty}$  is minimized.
- Suboptimal H<sub>∞</sub> Control: Given γ > 0, find all admissible controllers K(s) such that ||T<sub>zω</sub>||<sub>∞</sub> < γ.</p>

#### $\mathcal{H}_\infty ext{-synthesis}$



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#### $\mathcal{H}_\infty$ -synthesis

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- Tracking
- Disturbance rejection
- Measurement noise
- Moderate command signal





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## Tracking

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 $\Rightarrow$  regulated variables = T(external signals)

#### $\mathcal{H}_\infty ext{-synthesis}$

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#### 

- Tracking
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- Measurement noise
- Moderate command signal

⇒ regulated variables = T(external signals)
Performance as Generalized Disturbance
Rejection

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 $\mathcal{H}_{\infty} ext{-synthesis}$ 

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#### Generalized and Weighted Performance Block Diagram



#### Use of weights to handle magnitudes and frequency dependency

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## Resolution

 Matlab Robust control toolbox: K,CL,gamma= hinfsyn(P,nmeas,ncont,gam)



# Robust synthesis $\mathcal{H}_{\infty}$ -synthesis

w

u

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## Resolution

- Matlab Robust control toolbox:
   K,CL,gamma= hinfsyn(P,nmeas,ncont,gam)
   Bioosti
  - Riccati

G

K

z

y

 $\mathcal{H}_{\infty}$ -synthesis

# **Uncertainty and**

- Where does uncertainty come from?

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#### $\mathcal{H}_\infty$ -synthesis

 ${\cal H}_\infty$  -Loopshaping synthesis



## zwGyuK

# Resolution

- Matlab Robust control toolbox: K,CL,gamma= hinfsyn(P,nmeas,ncont,gam)
  - Riccati
  - LMIs

# Robust synthesis $\mathcal{U}_{\mathcal{U}}$ synthesis

 $\mathcal{H}_\infty ext{-synthesis}$ 

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# 

# Resolution

- Matlab Robust control toolbox: K,CL,gamma= hinfsyn(P,nmeas,ncont,gam)
  - Riccati
  - LMIs

K has the same order than P + centralized structure

 $\mathcal{H}_\infty ext{-synthesis}$ 

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# z w G u w u k u

# Resolution

- Matlab Robust control toolbox: K,CL,gamma= hinfsyn(P,nmeas,ncont,gam)
  - Riccati
  - LMIs
- K has the same order than P + centralized structure
- structured version with hinfstruct

 $\mathcal{H}_\infty ext{-synthesis}$ 

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# z w G u u w u w u u

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- Matlab Robust control toolbox: K,CL,gamma= hinfsyn(P,nmeas,ncont,gam)
  - Riccati
  - LMIs
- K has the same order than P + centralized structure
- structured version with hinfstruct
- → Controller reduction

w

u

 $\mathcal{H}_{\infty} ext{-synthesis}$ 

z

y

# Uncertainty and robustness

- Where does uncertainty come from?
- Modelling uncertainty
- Robustness
- Small gain theorem
- Robust stability
- Robust performance

#### Robust synthesis

#### $\mathcal{H}_\infty$ -synthesis

 $\mathcal{H}_\infty$  -Loopshaping synthesi  $\mu$  -analysis and synthesis



# Resolution

- Matlab Robust control toolbox: K,CL,gamma= hinfsyn(P,nmeas,ncont,gam)
  - Riccati
  - LMIs
- K has the same order than P + centralized structure
- structured version with hinfstruct
- → Controller reduction
- Difficulty to tune the weights

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K

 $\mathcal{H}_{\infty} ext{-synthesis}$ 

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- K has the same order than P + centralized structure
- structured version with hinfstruct
- → Controller reduction
- Difficulty to tune the weights
- → Use systume : Specify only high-level design requirements (reference tracking, overshoot, disturbance rejection, or open-loop stability margins)



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Control System Synthesis

#### 09/09/2020 21/31

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# Further reading

Riccati approach

**Robust synthesis** 

- Doyle, J.C., K. Glover, P. Khargonekar, and B. Francis. *State-space solutions to standard* H<sub>2</sub> and H<sub>∞</sub> control problems. IEEE Transactions on Automatic Control, 1989.
- 2 LMI approach

 $\mathcal{H}_{\infty}$ -synthesis

- Gahinet, P., and P. Apkarian. *A linear matrix inequality approach to* H<sub>∞</sub>*-control.* International Journal of Robust and Nonlinear Control, 1994.
- **3** Structured  $\mathcal{H}_{\infty}$ -controller design
  - P. Apkarian and D. Noll, *Nonsmooth H-infinity Synthesis*, IEEE Transactions on Automatic Control, 2006.



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#### Robustness in the $\mathcal{H}_\infty$ framework



- Keep  $T_{z_1\omega_1}$  and  $T_{z_2\omega_2}$  small
- Robustness objectives = additional "disturbance to error" transfer functions to be kept small

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# Glover-McFarlane Method Step 1: Loop-shaping

Considering the nominal plant P, shape the desired open-loop through a precompensator  $W_1$  and a postcompensator  $W_2$ 

$$P_s = W_2 P W_1$$

Typical good open-loop design

Large gain in the low frequency region (disturbance rejection)

<u>σ</u>(*PK*) >> 1

Small gain in the high frequency region:

 $\overline{\sigma}(PK) \ll 1$ 

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# Glover-McFarlane Method Step 2: Robust stabilization

• Normalize coprime factorization  $P_s = M^{-1}N$ 

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# Glover-McFarlane Method Step 2: Robust stabilization

- Normalize coprime factorization  $P_s = M^{-1}N$
- Uncertainty  $P_{\Delta} = (M + \Delta_M)^{-1}(N + \Delta_N)$  with  $\Delta_M, \Delta_N \in \mathcal{RH}_{\infty}$  and  $\|[\Delta_M, \Delta_N]\|_{\infty} < \varepsilon$



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## Glover-McFarlane Method Step 2: Robust stabilization

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- **Small-gain theorem:** if K is stabilizing, the closed-loop is robustly stable iff

$$\left\| \begin{bmatrix} I\\ K \end{bmatrix} (I + P_s K)^{-1} M^{-1} \right\|_{\infty} \leq \frac{1}{\varepsilon}$$

09/09/2020 25/31



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→ you want to have  $\varepsilon$  as big as possible. If  $\varepsilon_{max}$  is not big enough, redesign  $W_1$  and  $W_2$ 

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# Glover-McFarlane Method Step 3: Combine loop-shaping and robust stabilization

Synthesize a controller  $K_{\infty}$  satisfying



$$\left\| \begin{bmatrix} I\\ K \end{bmatrix} (I+P_sK)^{-1}M^{-1} \right\|_{\infty} \leq \frac{1}{\varepsilon}$$

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 $W_1$ 

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## **Glover-McFarlane Method**

- McFarlane, D.C., and K. Glover, A Loop Shaping Design Procedure using Synthesis, IEEE Transactions on Automatic Control, 1992
  - Zhou, K., Doyle, J. C., Essentials of robust control, 1998



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## Motivations:

- Loopshaping is done without handling closed-loop stability requirements.
- Robust stabilization is done without frequency weighting.

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## Motivations:

- Loopshaping is done without handling closed-loop stability requirements.
- Robust stabilization is done without frequency weighting.
- $\varepsilon$  is a measure of both closed-loop robust stability and the success of the design in meeting the loop-shaping specifications.



Uncertainty and robustness

Small gain theorem

 $\mathcal{H}_{\infty}$  -synthesis  $\mathcal{H}_{\infty}$  -Loopshaping synthesis  $\mu$  -analysis and synthesis

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# Robust synthesis $\mu$ -analysis and synthesis

Uncertainty may be modeled in two ways:

as external inputs



Uncertainty and

Small gain theorem

 $\mathcal{H}_\infty$  -synthesis

 $\mathcal{H}_\infty$  -Loopshaping synthesis  $\mu$ -analysis and synthesis

Where does uncertainty come from?

# Robust synthesis $\mu$ -analysis and synthesis

Uncertainty may be modeled in two ways:

- as external inputs
- as perturbations to the nominal model



# Incertainty may be modeled in two

## Uncertainty and robustness

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#### **Analysis framework**



 $\Delta$  is a structured block

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# Let $\beta > 0$ . Then this interconnected system is well-posed and internally stable for all $\Delta(s) \in \mathcal{M}(\Delta)$ with $\|\Delta\|_{\infty} \leq 1/\beta$ , and $\|\mathcal{F}(N, \Delta)\|_{\infty} \leq \beta$ , if and only if

$$\sup_{\omega\in\mathbb{R}}\mu_{\Delta}(M(\jmath\omega))\leq\beta$$

# Analysis framework



 $\Delta$  is a structured block

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*u*-analysis

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## Analysis framework



## $\Delta$ is a structured block

- **\mathcal{F}(N, \Delta)** is the transfer from  $\omega$  to z
- $\mu_{\Delta}$  is defined as

$$\mu_{\Delta}(M) = \frac{1}{\min\{\overline{\sigma}(\Delta) : \Delta \in \mathcal{M}(\Delta), \det(I - M\Delta) = 0\}}$$

unless no  $\Delta$  makes  $I - M\Delta$  singular, in which case  $\mu_{\Delta}(M) = 0$ .

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1

# $\mu\text{-synthesis}$

- $\rightarrow$  Iterative process called D-K iteration
  - Uses  $\mathcal{H}_\infty\text{-synthesis}$  to find a controller that minimizes the closed-loop gain of the nominal system.



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- $\rightarrow$  Iterative process called D-K iteration
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- **2 D-step**: Robustness analysis to estimate  $\mu_{\Delta}$  and a new scaling *D*.


# $\begin{array}{c|c} \textbf{Robust synthesis} \\ \mu\text{-analysis and synthesis} \end{array}$

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- **3** K-step: New controller design to minimize the new scaled  $\mathcal{H}_{\infty}$ -norm obtained in step 2.



**Robust synthesis** µ-analysis and synthesis

Robust performance

Uncertainty and robustness Where does uncertainty come from?

#### Robust synthesis

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- 4 Repeats steps 2 and 3 until the robust performance stops improving.

## **Robust synthesis** $\mu$ -analysis and synthesis

### **Uncertainty and**

- Where does uncertainty come from?

 $\mathcal{H}_{\infty}$  -synthesis  $\mu$ -analysis and synthesis



## $\mu$ -synthesis

- $\rightarrow$  Iterative process called D-K iteration
- Uses  $\mathcal{H}_{\infty}$ -synthesis to find a controller that minimizes the closed-loop gain of the nominal system.
- **D-step**: Robustness analysis to estimate  $\mu_{\Lambda}$  and a new scaling D. 2
- **K-step**: New controller design to minimize the new scaled  $\mathcal{H}_{\infty}$ -norm 3 obtained in step 2.



Repeats steps 2 and 3 until the robust performance stops improving.

### Extremely computationally demanding!

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Understand and model uncertainty



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# Major goal of robust control: stability and performance under uncertainty

- Understand and model uncertainty
- Robustness analysis
  - small-gain theorem



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