

# **ECE 171A: Linear Control System Theory**

## **Lecture 25: Robust Stability and Fundamental Limits**

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# Final Exam

**Final Exam** — 8:00 am - 10:30 am, June 12

- ▶ **Scope:** Lectures 1 - 27, HW1 - HW8, DI 1-10; (Reading materials in the textbook)
- ▶ This final exam is closed book but you can bring **one sheet of notes**
  - page maximum size: Letter; can be double-sided;
  - should be hand-written (you can also write on your iPad and print it);
  - it is not acceptable to directly copy-paste lecture notes/HW/textbook.
- ▶ The exams must be done in a blue book. Bring a blue book with you.
- ▶ No MATLAB is required. No graphing calculators are permitted. You need a basic arithmetic calculator for simple calculations.
- ▶ **No collaboration and discussions are allowed.** It is dishonest to cheat on exams. Instances of academic dishonesty will be referred to the Office of Student Conduct for adjudication. *You don't want to take a risk for such a small thing.*

## Student Evaluations of Teaching (SET)

- ▶ You should have got the following link from UCSD Online Evaluations to evaluate ECE 171A

<https://academicaffairs.ucsd.edu/Modules/Evals/?e11360527>

- ▶ **Deadline:** Saturday, June 08 at 8:00 am
- ▶ Your responses are completely anonymous.
- ▶ It's your opportunity to let your voices be heard (by our team, the department, and the university).
- ▶ Please give some **thoughtful** and **constructive** feedback.
- ▶ If you like the course, please say it explicitly and we'd love to hear it
- ▶ If you think some aspects can be further improved, we are more than happy to know them (we have implemented some suggestions from previous surveys)

**Many thanks for your efforts and your time in this course!**

# Outline

Robust stability

Fundamental limits - System design considerations

Summary

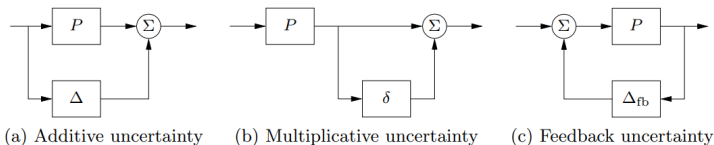
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## Unmodeled dynamics



**Figure 13.2:** Unmodeled dynamics in linear systems. Uncertainty can be represented using additive perturbations (a), multiplicative perturbations (b), or feedback perturbations (c). The nominal system is  $P$ , and  $\Delta$ ,  $\delta$ , and  $\Delta_{fb}$  represent unmodeled dynamics.

- ▶ **Additive uncertainty:** the true plant dynamics are in the range of

$$\tilde{P}(s) = P(s) + \Delta(s), \quad |\Delta(i\omega)| < \epsilon, \quad \forall \omega \in \mathbb{R}.$$

- ▶ **Multiplicative uncertainty:**

$$\tilde{P}(s) = P(s)(1 + \delta(s)), \quad |\delta(i\omega)| < \epsilon, \quad \forall \omega \in \mathbb{R}.$$

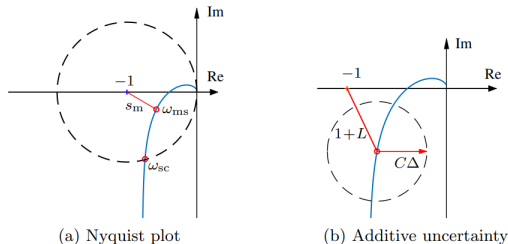
- ▶ **Feedback uncertainty:**  $\tilde{P}(s) = \frac{P}{1 - P\Delta_{fb}}$ ,  $|\Delta_{fb}(i\omega)| < \epsilon, \forall \omega \in \mathbb{R}$

- ▶ The specific form that is used depends on what provides the best representation of the unmodeled dynamics.

# Robust stability

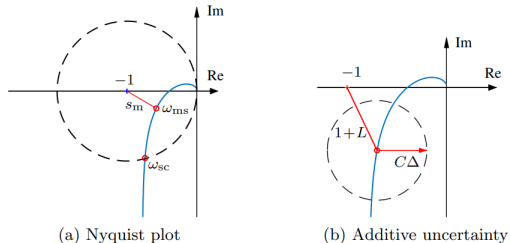
**Robust stability:** when can we formally show that the stability of a system is robust with respect to process variations?

- ▶ **Nyquist criterion:** a powerful and elegant way to study the effects of uncertainty.
- ▶ The stability margin  $s_m$  is a good robustness measure.



**Figure 13.7:** Illustrations of robust stability in Nyquist plots. The plot (a) shows the stability margin  $s_m = 1/M_s$ . The plot (b) shows the Nyquist curve and the circle shows uncertainty due to stable additive process variations  $\Delta$ .

## Robust stability - explicit conditions



**Figure 13.7:** Illustrations of robust stability in Nyquist plots. The plot (a) shows the stability margin  $s_m = 1/M_s$ . The plot (b) shows the Nyquist curve and the circle shows uncertainty due to stable additive process variations  $\Delta$ .

- ▶ If the process is changed from  $P(s)$  to  $P(s) + \Delta(s)$ , the loop transfer function changes from  $P(s)C(s)$  to

$$(P(s) + \Delta(s))C(s).$$

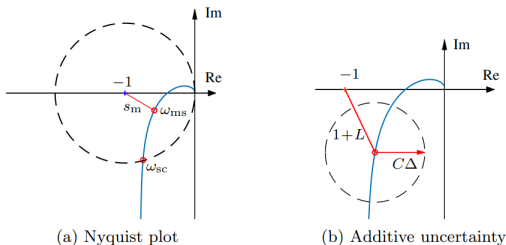
- ▶ Assume that  $\Delta(s)$  is stable, the closed-loop system remains stable as long as the perturbed loop transfer function

$$(P + \Delta)C$$

never reaches the critical point  $-1$ .



## Robust stability - explicit conditions



**Figure 13.7:** Illustrations of robust stability in Nyquist plots. The plot (a) shows the stability margin  $s_m = 1/M_s$ . The plot (b) shows the Nyquist curve and the circle shows uncertainty due to stable additive process variations  $\Delta$ .

- ▶ The distance from  $-1$  to  $L = PC$  is  $|1 + L|$ .
- ▶ The perturbed Nyquist curve will not reach  $-1$  provided that

$$|C\Delta| < |1 + L| \quad (1)$$

- ▶ (1) holds if

$$|\Delta| < \left| \frac{1+L}{C} \right|, \quad \text{or} \quad |\delta| < \left| \frac{1+L}{L} \right| = \frac{1}{|T|}, \quad \text{where } \delta = \frac{\Delta}{P} \quad (2)$$

## Robust stability - explicit conditions

The condition (2) must be valid all all points on the Nyquist curve — point-wise for all frequencies

$$|\delta(i\omega)| < \left| \frac{1 + L(i\omega)}{L(i\omega)} \right| = \frac{1}{|T(i\omega)|}, \quad \forall \omega \geq 0. \quad (3)$$

- ▶ **Condition (3) is one of the reasons why feedback systems work so well in practice.**
  - The models used to design control systems are often simplified, and the properties of a process may change during operation.
  - Condition (3) implies that the closed loop system will at least be stable for substantial variations in the process dynamics

The peak value of the complimentary sensitivity transfer function:

$$M_t = \max_{\omega} |T(i\omega)| := \left\| \frac{PC}{1 + PC} \right\|_{\infty}$$

- ▶ Condition (3) becomes  $|\delta(i\omega)| < 1/M_t, \forall \omega \geq 0$ .
- ▶ Reasonable values of  $M_t$  are from 1.2 to 2.

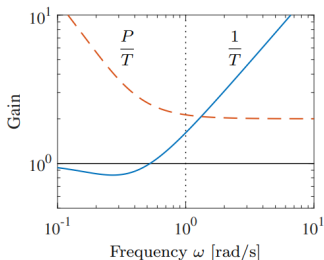
## Example

### Example (Example 13.7: Cruise Control)

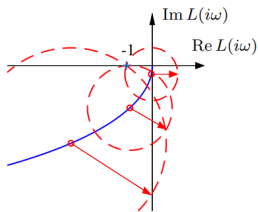
The model of the car in the fourth gear at speed 20m/s is

$$P(s) = \frac{1.32}{s + 0.01}$$

- Consider a PI controller with gains  $k_p = 0.5$  and  $k_i = 0.1$ .



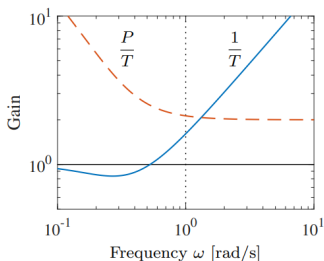
(a) Bounds on process uncertainty



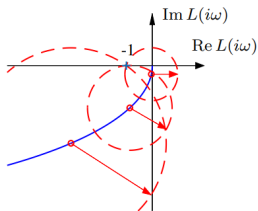
(b) Nyquist plot representation of bounds

Figure: Robustness of a cruise controller

## Example



(a) Bounds on process uncertainty

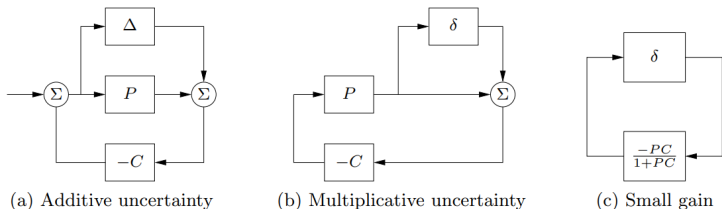


(b) Nyquist plot representation of bounds

### Some observations:

- ▶ Moderately small uncertainties are required only around the **gain crossover frequencies**,
- ▶ but large uncertainties can be permitted at higher and lower frequencies.
- ▶ A simple model that describes the process dynamics well around the crossover frequency is often sufficient for design

## Other robustness conditions



**Figure:** Illustration of robustness to process perturbations<sup>1</sup>

**Table 13.1:** Conditions for robust stability for different types of uncertainty.

Process	Uncertainty Type	Robust Stability
$P + \Delta$	Additive	$\ CS\Delta\ _\infty < 1$
$P(1 + \delta)$	Multiplicative	$\ T\delta\ _\infty < 1$
$P/(1 + \Delta_{fb} \cdot P)$	Feedback	$\ PS\Delta_{fb}\ _\infty < 1$

<sup>1</sup>The details of these sufficient conditions are not required in this class.

# Outline

Robust stability

Fundamental limits - System design considerations

Summary

# System design

The *initial design of a system* can have a significant impact on the ability to use feedback to provide **robustness** and **performance improvements**.

- ▶ It is particularly important to recognize fundamental limits in the performance of feedback systems early in the design process.
- ▶ Awareness of the limits and **co-design** of the process and the controller are good to avoid potential difficulties both for system and control designers.

## Examples:

- ▶ We may expect that a system with **time delays** cannot admit fast control because control actions are delayed.
- ▶ It seems reasonable that **unstable systems will require fast controllers**, which will depend on the **bandwidth** of sensors and actuators.
- ▶ These limits are caused by properties of the system dynamics and can often be captured by conditions on the **poles and zeros** of the process

## System design

The freedom for the control designer depends very much on the situation

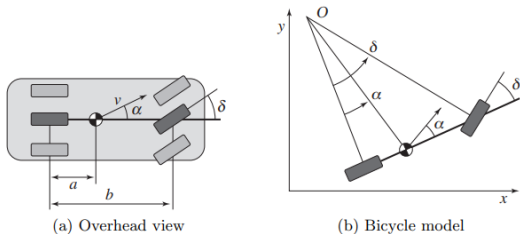
- ▶ **Extreme 1 (limited freedom):** a process with given sensors and actuators and his or her task is to design a suitable controller
  - Even further, you may be given with an existing control loop, and your task is to retrofit the system.
- ▶ **Extreme 2 (significant freedom):** You can choose sensors/actuators
  - **Co-design** the location and characteristics of sensors, actuators, and controller simultaneously.
  - However, you may have budget limits.

**Performance limits** due to dynamics and limits on actuation power/rate.

- ▶ **Dynamics limitations:** captured by time delays and poles and zeros in the right half-plane.
  - Time delays are easy to understand.
  - A less obvious case is that a process with a right half-plane pole/zero pair cannot be controlled robustly if the pole is close to the zero (details are not required in this class).
- ▶ **Restriction in actuation:** captured by actuation power and rates.



## Example: Vehicle steering



**Figure:** Vehicle steering dynamics. The left figure shows an overhead view of a vehicle with four wheels. The wheelbase is  $b$ .

- ▶ The center of mass at a distance  $a$  forward of the rear wheels.
- ▶ Approximation with a single front wheel and a single rear wheel — an abstraction called the **bicycle model**.
- ▶ The steering angle is  $\delta$  and the velocity at the center of mass has the angle  $\alpha$  relative the length axis of the vehicle.
- ▶ The position is given by  $(x, y)$  and the orientation (heading) by  $\theta$ ; For ODE modeling, see Example 3.11

## Example: Vehicle steering

### Example (Frequency modeling for vehicle steering)

The transfer function from steering angle  $\delta$  to lateral position  $y$  is

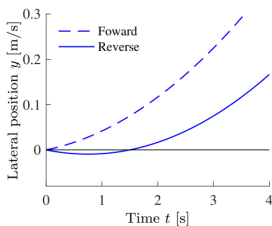
$$P(s) = \frac{av_0s + v_0^2}{bs^2}$$

- ▶  $v_0$  is the velocity of the vehicle and  $a, b > 0$
- ▶ The transfer function has a zero

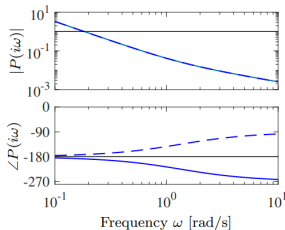
$$s = -\frac{v_0}{a}.$$

- In normal (forward) driving this zero is in the left half-plane,
  - but it is in the right half-plane when driving in reverse ( $v_0 < 0$ ).
- ▶ The unit step response is  $y(t) = \frac{av_0}{b}t + \frac{v_0^2}{2b}t^2$ 
    - The lateral position thus begins to respond immediately to a steering command as an integrator.
    - If  $v_0 < 0$  (reverse steering), the initial  $y(t)$  is in the wrong direction!!
    - This behavior is representative for **non-minimum phase systems** (called an **inverse response**).

## Example: Vehicle steering



(a) Step response

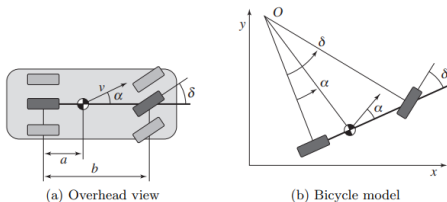


(b) Frequency response

Figure: Vehicle steering for driving in reverse. (a) Step responses; (b) frequency responses

- ▶ The step response for forward and reverse driving is shown above.
- ▶ The parameters are  $a = 1.5m$ ,  $b = 3m$ ,  $v_0 = 2m/s$  for forward driving, and  $v_0 = -2m/s$  for reverse driving.
- ▶ When driving in reverse, there is an initial motion of the center of mass in the opposite direction
- ▶ there is **A DELAY** before the car begins to move in the desired manner.

## Example: Vehicle steering



The existence of the right half-plane zero can be removed

- ▶ if we choose to measure the location of the vehicle by the position of the center of the rear wheels instead of the center of mass

$$a = 0, \quad P(s) = \frac{v_0^2}{bs}$$

- ▶ This is easily implemented by calibrating the position sensor for the vehicle
- ▶ This choice of “sensor” is subject to calibration errors  $\epsilon$  and this can lead to a zero of the process transfer function at  $v_0/\epsilon$
- ▶ This is called a **“fast” zero** and its impact is relatively minor.

## Poles and Zeros

- ▶ The poles of a system depend on the intrinsic dynamics of the system.
- ▶ They represent the modes of the system and they are given by the eigenvalues of the dynamics matrix  $A$  of the linearized model.
  - For example, we have the initial response to  $\dot{x} = Ax$

$$x_i(t) = e^{\lambda_i t} x_i(0).$$

Sensors and actuators have no effect on the poles: **the only way to change poles is by feedback or by redesign of the process.**

- ▶ However, the zeros of a system depend on how the sensors and actuators are connected to the process.
- ▶ Zeros can thus be changed by **moving or adding sensors and actuators**, which is often simpler than redesigning the process dynamics

# Outline

Robust stability

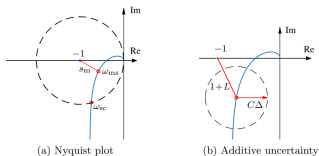
Fundamental limits - System design considerations

Summary

## Summary

- ▶ An explicit sufficient **robustness condition** based on Nyquist criterion

$$|C\Delta| < |1 + L|, \quad \text{or} \quad |\delta(i\omega)| < \left| \frac{1 + L(i\omega)}{L(i\omega)} \right| = \frac{1}{|T(i\omega)|}, \quad \forall \omega \geq 0.$$



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- ▶ **Performance limits** due to process dynamics and limits on actuation power/rate.
  - **Dynamics limitations:** captured by time delays and poles and zeros in the right half-plane.
    - ▶ Sensors and actuators have no effect on the poles: **the only way to change poles is by feedback or by redesign of the process.**
    - ▶ However, the zeros of a system depend on how the sensors and actuators are connected to the process.
  - **Restriction in actuation:** captured by actuation power and rates.