

# EL2520 Control Theory and Practice

# Welcome!

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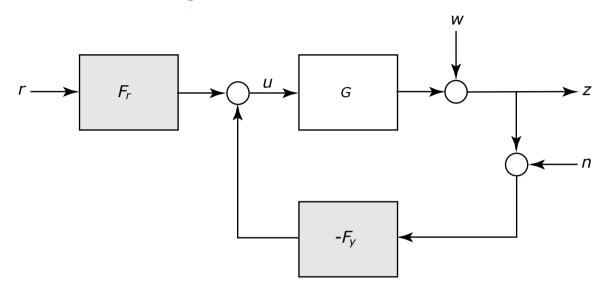
# The practical

- Course information and schedule
   <u>https://www.kth.se/social/course/EL2520/</u>
- All slides and exercises available on homepage after class
- Course book: English and Swedish versions; Kåren or Internet
- Course material and practicalities: STEX, Osquldas väg 10
- Computer exercises: need kth.se account
- Register for labs via home page, from 22<sup>nd</sup> of March
- Lab access: details next week
- Expectations and feedback: email me at mikaelj@ee.kth.se

## Course elements

- 14 lectures, Mikael Johansson
- 8 exercise sessions, Olle Trollberg
  - all exercises given in English
  - one Q&A session per week
- 4 computer exercise sessions, Håkan Terelius
  - groups of 2 students
  - written report on exercise 1 and 2, (short sheet on 3, 4)
- 1 project
  - groups of 4 students
  - two sessions in laboratory, written report
- Exam: 5 hours, written exam on 25<sup>th</sup> of May 2012, 09.00-14.00

## Why feedback control?



- Make a system behave as desired
  - e.g. stabilize unstable system
- Reduce effects of disturbances and component variations
  - e.g. keep variables constant
- New freedom for designers
  - physical design vs. feedback control

# Why "Control Theory and Practice"?

- Solve complex control problems
  - Fundamental limitations
  - Sensitivity and robustness analysis
  - Systems with multiple inputs and outputs
  - Controller design using optimization
  - Systems with constraints
  - Computer-based control systems
- Understand dynamic systems! The research front
- Applications!

#### Course structure

- 1. Basic control revisited
- 2. Modern control of multivariable linear systems
- 3. Control of systems with constraints

- (4 lectures)
- (7 lectures)
- (2 lectures)

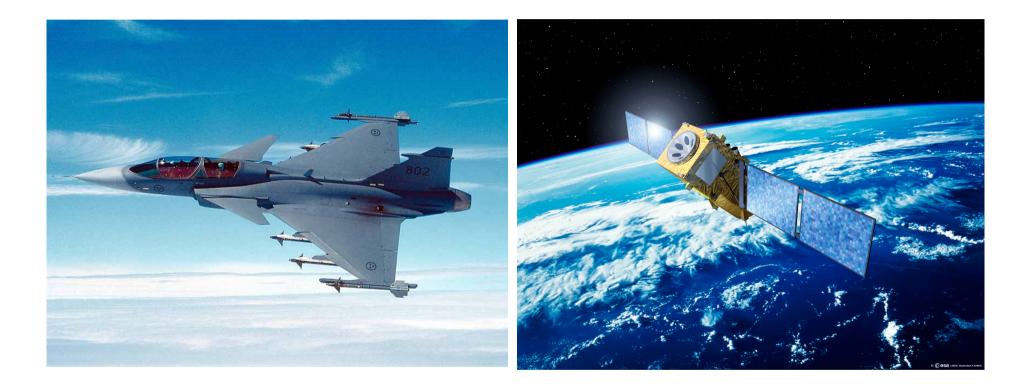
# Applications

Use control theory to analyze and modify system properties!

Applications in most engineering domains:

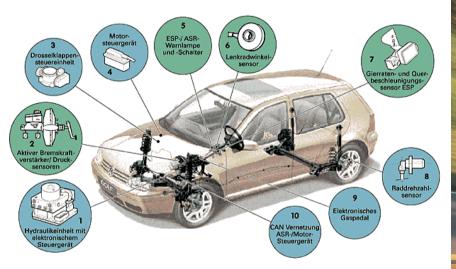
- Aerospace
- Cars and heavy vehicles
- Autonomous systems and robots
- Process industry
- Consumer products
- Communication systems
- Economics
- Biology
- ...

# Aerospace



## Vehicle control

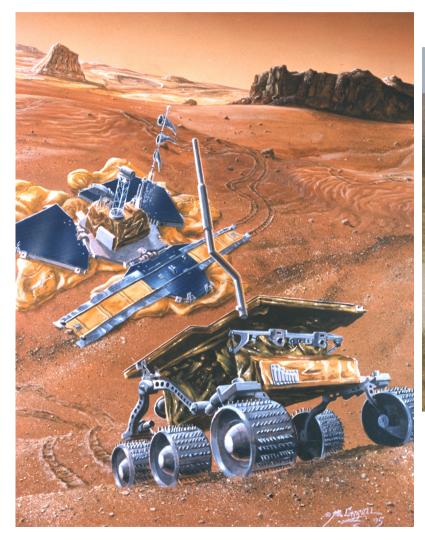
Elektronisches Stabilitätsprogramm (ESP)





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#### Autonomous systems and robotics





# **Process industry**



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# **Consumer products**



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#### Course structure

- 1. Basic control revisited
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- (4 lectures)
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#### How to learn more?

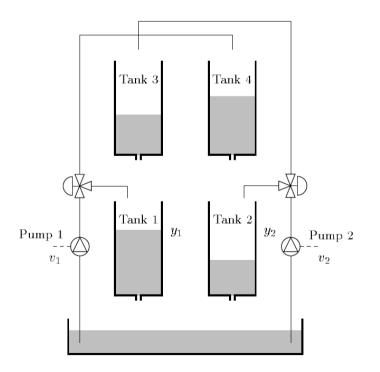
- Internet (e.g., links at <u>www.ee.kth.se</u>)
- Books (see course information, home page)
- Journals (IEEE Transactions on Automatic Control, Automatica, ...)
- Courses (Nonlinear Control, Modelling of Dynamical Systems, ...)
- Software (Matlab, ...)
- Interact with us, and take the opportunity to learn!

# Central component: multivariable systems

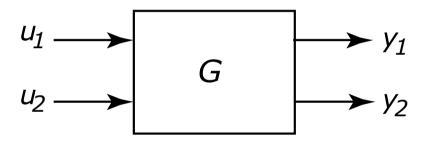
Key aspects:

- several inputs and outpus,
- dynamics coupled (single input affects many outputs)

Laboratory project example: quadruple tank system



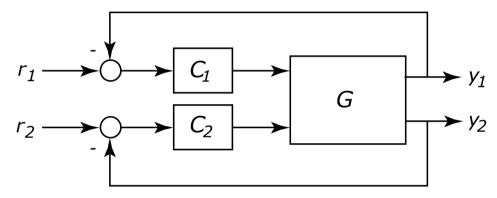
**Example**. Consider a linear system with two inputs and two outputs



$$Y_1(s) = \frac{2}{s+1}U_1(s) + \frac{3}{s+2}U_2(s)$$
$$Y_2(s) = \frac{1}{s+1}U_1(s) + \frac{1}{s+1}U_2(s)$$

Note: inputs influence both outputs!

Simple approach: pair inputs and outputs, use SISO control



Use  $u_1$  to control  $y_1$  and  $u_2$  to control  $y_2$ . PI-control

$$U_i(s) = \frac{K_i(s+1)}{s} (R_i(s) - Y_i(s)) \quad i = 1, 2$$

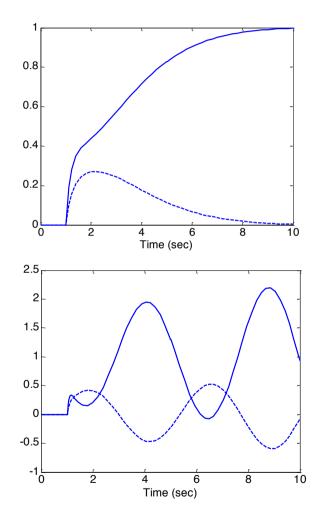
gives transfer functions

$$G_{r_1 \to y_1} = \frac{2K_1}{2 + 2K_1} \quad G_{r_2 \to y_2} = \frac{K_2}{s + K_2}$$

Stable for all (strictly) positive values of K<sub>1</sub>, K<sub>2</sub>!

Response to step-change in  $r_1$  when  $K_1=1$ ,  $K_2=2$ ...

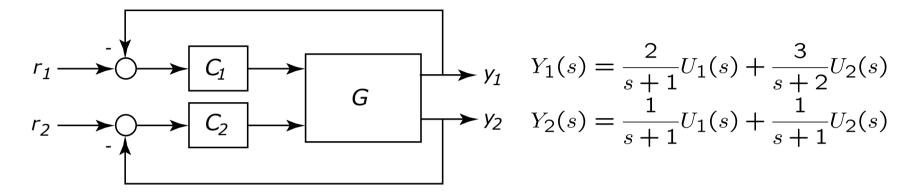
...and when  $K_1=4$ ,  $K_2=8$ 



Multivariable system unstable, even if SISO analysis indicates stability!

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# What is happening?



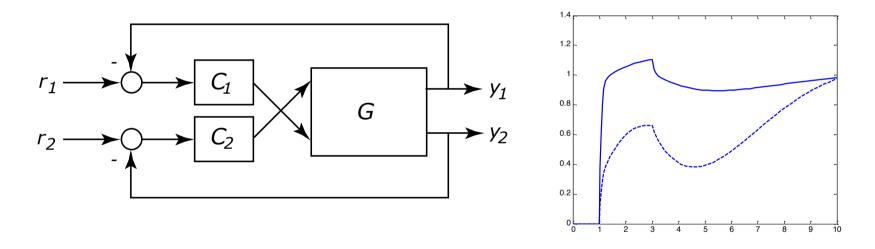
Interactions in the system makes the control loops coupled!

Multivariable analysis

$$\begin{bmatrix} Y_1 \\ Y_2 \end{bmatrix} = \begin{bmatrix} G_{11} & G_{12} \\ G_{21} & G_{22} \end{bmatrix} \begin{bmatrix} C_1 & 0 \\ 0 & C_2 \end{bmatrix} (\begin{bmatrix} R_1 \\ R_2 \end{bmatrix} - \begin{bmatrix} Y_1 \\ Y_2 \end{bmatrix}) \Rightarrow Y = (I + GC)^{-1}GCR$$

Elements of closed-loop transfer matrix very different from SISO analysis!

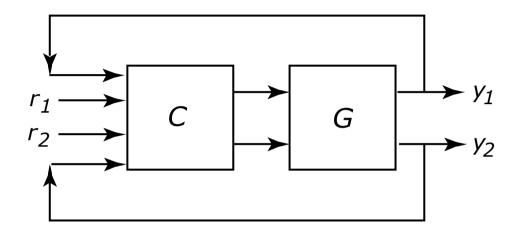
What if we pair signals "the other way around"? (with new controllers)



A system with strong and complex interactions!

 Can no longer stabilize system with positive gains (and system becomes unstable when if one of these controllers fail)

# What to do?



Learn the material in this course!

- Understand dynamics of multivariable systems
- Analyze when interactions are harmful, or constraining.
- Design multivariable controllers
  - that use  $Y_1$ ,  $Y_2$ ,  $R_1$  and  $R_2$  simultaneously to compute  $U_1$  and  $U_2$
  - optimal controllers, or combinations of simple SISO controllers

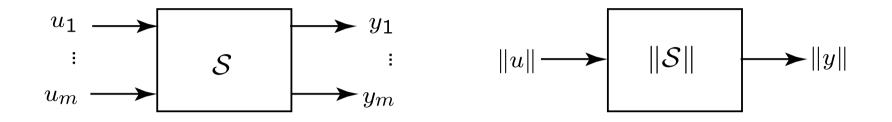
(the course contains more than this...)

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#### Part I – Basic Control Revisited

Lecture 1: Signal norms, system gains, and input-output stability Lecture 2: Analysis and specification of closed loop performance Lecture 3: Robustness of closed loop system to model uncertainties Lecture 4: Fundamental limitations

# Systems as "mapping of signals"



Key components:

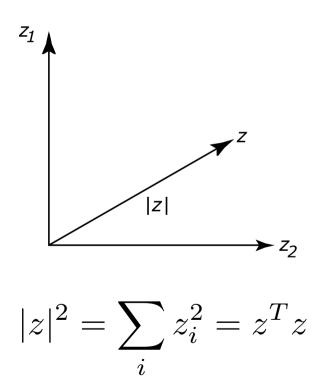
- Signal norms: measure "size" of signals
- System gains: measure the system's amplification
- Frequency responses

Admits natural extensions from scalar to multivariable systems!

#### Vector norms

Vector norms measure the "size" of vectors.

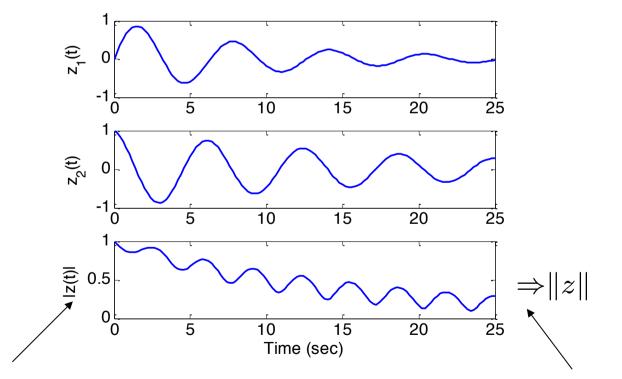
- common choice: Euclidian norm (also known as 2-norm)



### Signal norms

Signals are functions of time

- signal norms measure size across both space and time.



summing up over channels

summing up over time

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# Signal norms

The *peak-norm*, or  $L_{\infty}$ -norm, of a signal is defined as

$$||z||_{\infty} = \sup_{t \ge 0} |z(t)|$$

A signal is *bounded* if its peak-norm is bounded (  $\|z\|_{\infty} < \infty$  )

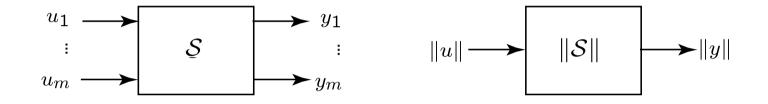
The energy-norm, or  $L_2$ -norm, of a signal is defined as  $\|z\|_2 = \sqrt{\int_{-\infty}^\infty |z(t)|^2 \, dt}$ 

A signal is *finite-energy* if  $\|z\|_2 < \infty$ 

**Note:** bounded signals may have infinite energy (and vice versa) we will only work with the 2-norm in this course

# The energy-gain of a system

Measures "energy amplification" of system



The amplification for a specific signal  $u \neq 0$  is given by

$$\frac{\|y\|_2}{\|u\|_2} = \frac{\|\mathcal{S}u\|_2}{\|u\|_2}$$

The (energy) gain is the maximal amplification (over all finite-energy signals)

$$\|\mathcal{S}\| = \sup_{0 < \|u\|_2 < \infty} \frac{\|\mathcal{S}u\|_2}{\|u\|_2}$$

## Finite gains and stability

**Theorem.** The linear time-invariant system y = Gu maps any signal u of finite energy into a signal y of finite energy if and only if the transfer function G(s) is stable.

#### Energy gains of scalar linear systems

Stable scalar linear time-invariant system S: Y(s) = G(s)U(s)

Assume that  $|G(i\omega)| \leq K$  with equality for  $\omega = \omega^*$ 

Then, Parseval's theorem yields

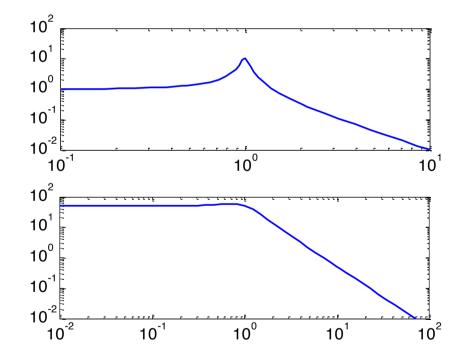
$$||y||_{2}^{2} = \frac{1}{2\pi} \int_{-\infty}^{\infty} |Y(i\omega)|^{2} d\omega =$$
  
=  $\frac{1}{2\pi} \int_{-\infty}^{\infty} |G(i\omega)|^{2} |U(i\omega)|^{2} d\omega \le K^{2} ||u||_{2}^{2}$ 

Since equality holds for  $u(t) = \sin(\omega^* t)$ , we have

$$\|\mathcal{S}\| = \sup_{\omega} |G(i\omega)| = \|G\|_{\infty}$$

# Quiz: energy gains and Bode diagrams

**Quiz:** the Bode diagrams below represent two different linear time-invariant systems. Which one has the largest energy-gain?



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## Example: gain of nonlinear system

Static nonlinear system

S: y(t) = f(u(t))where  $|f(x)| \le K|x|$ with equality for  $x = x^{\star}$  $u \longrightarrow f(u) \longrightarrow y$ 

Since

$$\|y\|_{2}^{2} = \int_{-\infty}^{\infty} |f(u(t))|^{2} dt \le \int_{-\infty}^{\infty} K^{2} |u(t)|^{2} dt = K^{2} \|u\|_{2}^{2}$$

the energy gain is

$$\|\mathcal{S}\| = \sup_{u} \frac{\|y\|_2}{\|u\|_2} = K$$

#### Example: gains of static linear systems

Consider the static linear system y = Au with gain

$$||A|| = \sup_{u \neq 0} \frac{|Au|}{|u|}$$

Since

$$||A||_{2}^{2} = \sup_{u \neq 0} \frac{|Au|^{2}}{|u|^{2}} = \sup_{u \neq 0} \frac{u^{T} A^{T} A u}{u^{T} u} = \lambda_{\max}(A^{T} A)$$

the gain is the square root of the maximal eigenvalue of  $A^TA$ .

(the square roots of  $eig(A^TA)$  are called the *singular values* of A)

#### Quiz: a flavour of multivariable systems

Quiz: What is the gain of the following (static) systems

a) 
$$y = \begin{bmatrix} 0 & 1 \\ 0 & 0 \end{bmatrix} u$$

b) 
$$y = \begin{bmatrix} 1 & -1 \\ -1 & 1 \end{bmatrix} u$$

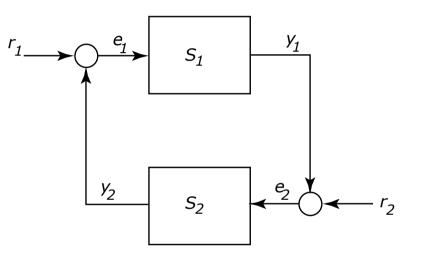
Which are the corresponding "worst-case" input vectors? (vectors u with |u|=1 that give the maximum value of |y|)

## Input-output stability

**Definition.** A system S is *input-output stable* if  $||S|| < \infty$ 

# Small gain theorem

**Theorem.** Consider the interconnection



If  $\mathcal{S}_1 \, \text{and} \, \mathcal{S}_2$  are input-output stable and

 $\|\mathcal{S}_1\|\cdot\|\mathcal{S}_2\|<1$ 

Then, the closed-loop system with  $r_1, r_2$  as inputs and  $e_1, e_2, y_1, y_2$  as outputs is input-output stable.

# **Proof sketch**

$$e_{1} = r_{1} + S_{2}(r_{2} + y_{1})$$
  

$$y_{1} = S_{1}e_{1}$$
  

$$\|e_{1}\| \leq \|r_{1}\| + \|S_{2}\|(\|r_{2}\| + \|S_{1}\| \cdot \|e_{1}\|)$$
  

$$\|e_{1}\| \leq \frac{\|r_{1}\| + \|S_{2}\| \cdot \|r_{2}\|}{1 - \|S_{2}\| \cdot \|S_{1}\|}$$

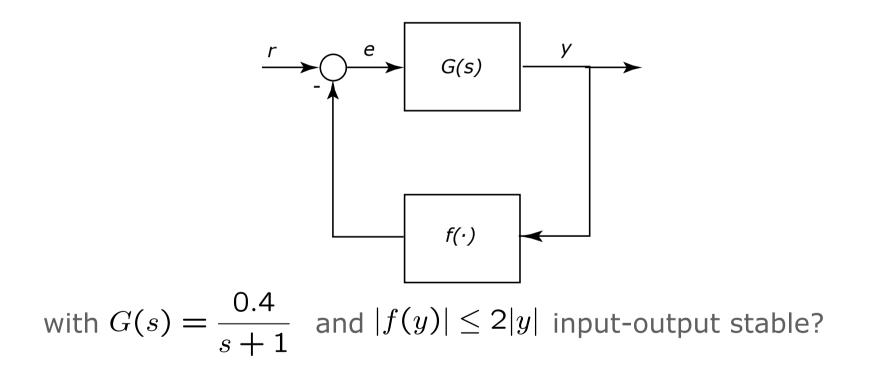
Hence, the gain from  $r_1, r_2$  to  $e_1$  is finite.

A similar argument proves that the gain from  $r_1, r_2$  to  $e_2$  is finite

**Note:** for linear system, it is sufficient that  $\|S_1S_2\| \leq 1$ 

## Quiz: a nonlinear interconnection

Is the feedback interconnection



# Conclusions

- Systems as mappings of signals
- Norms
  - Vector norms: measure size of vector "across channels"
  - Signal norms: measure size of signal across time and space
- Gains
  - The amplification of signal (in terms of the appropriate norm)
  - For stable linear systems, gain is infinity norm of frequency function
- Input-output stability and the small gain theorem

Next lecture: The closed-loop system (Chapter 6)