

**Course Goal** 

To provide students with a solid theoretical foundation of nonlinear control systems combined with a good engineering ability

You should after the course be able to

- recognize common nonlinear control problems,
- use some powerful analysis methods, and
- use some practical design methods.

#### Course Material, cont.

- Handouts (Lecture notes + extra material)
- Exercises (can be download from the course home page)
- ▶ Lab PMs 1, 2 and 3
- Home page
  - http://www.control.lth.se/course/FRTN05/
- Matlab/Simulink other simulation software see home page

# **Exercise sessions and TAs**

The exercises (28 hours) are offered twice a week;

#### Tue 15-17 Wed 15-17

NOTE: The exercises are held in either ordinary lecture rooms or the department laboratory on the bottom floor in the south end of the Mechanical Engineering building, **see schedule on home page.** 

Jerker Nordh

lh Jonas Dürango





- Practical information
- Course contents
- Nonlinear control phenomena
- Nonlinear differential equations

#### **Course Material**

- Textbook
  - Glad and Ljung, Reglerteori, flervariabla och olinjära metoder, 2003, Studentlitteratur,ISBN 9-14-403003-7 or the English translation Control Theory, 2000, Taylor & Francis Ltd, ISBN 0-74-840878-9. The course covers Chapters 11-16,18. (MPC and optimal control not covered in the other alternative textbooks.)
  - ALTERNATIVE: H. Khalil, Nonlinear Systems (3rd ed.), 2002, Prentice Hall, ISBN 0-13-122740-8. A good, but a bit more advanced book.
  - ALTERNATIVE (Hard to get/out of print): Slotine and Li, Applied Nonlinear Control, Prentice Hall, 1991. The course covers chapters 1-3 and 5, and sections 4.7-4.8, 6.2, 7.1-7.3.

#### Lectures and labs

The lectures (30 hours) are given as follows:

 Mon 13-15,
 M:D

 Wed 8-10,
 M:E,
 January 18 - February 22

 Thu 10-12
 M:D
 January 19



The lectures are given in English.

The three laboratory experiments are mandatory.

Sign-up lists are posted on the web at least one week before the first laboratory experiment. *The lists close one day before the first session.* 

The Laboratory PMs are available at the course homepage.

Before the lab sessions some home assignments have to be done. No reports after the labs.

#### **The Course**

- 14 lectures
- 14 exercises
- 3 laboratories
- 5 hour exam: March 7, 2012. Open-book exam: Lecture notes but no old exams or exercises allowed. Next exam on April 13, 2012

## Contents

- Introduction. Typical nonlinear problems and phenomena.
- Linearization. Simulation.
- Stability theory.
- Periodic solutions.
- Compensation for friction, saturation, back-lash etc.
- Optimal control.
- Nonlinear control design methods.

#### Common nonlinear phenomena

- Input-dependent stability
- Stable periodic solutions
- Jump resonances and subresonances

Nonlinear model structures

- Common nonlinear components
- State equations
- Feedback representation

# **Linear Systems**



Definitions: The system S is linear if

$$S(\alpha u) = \alpha S(u),$$
 scaling  
 $S(u_1 + u_2) = S(u_1) + S(u_2),$  superposition

A system is *time-invariant* if delaying the input results in a delayed output:

$$y(t-\tau) = S(u(t-\tau))$$

#### Linear models are not always enough

Example: Ball and beam



Linear model (acceleration along beam) : Combine  $F = m \cdot a = m \frac{d^2x}{dt^2}$  and  $F = mg \sin(\phi)$ :

$$\ddot{x}(t) = \frac{5g}{7}\phi(t)$$

**2 minute exercise:** Find a simple system  $\dot{x} = f(x, u)$  that is stable for a small input step but unstable for large input steps.

#### Linear time-invariant systems are easy to analyze

Different representations of same system/behavior

$$\begin{aligned} \dot{x}(t) &= Ax(t) + Bu(t), \quad y(t) = Cx(t), \quad x(0) = 0 \\ y(t) &= g(t) \star u(t) = \int g(r)u(t-r)dr \end{aligned}$$

$$Y(s) = G(s)U(s)$$

Local stability = global stability:

Eigenvalues of A (= poles of G(s)) in left half plane

Superposition:

Enough to know step (or impulse) response

Frequency analysis possible:

Sinusoidal inputs give sinusoidal outputs

#### Linear models are not enough

- x = position (meter)
- $\phi = \text{angle (radians)}$
- $g = 9.81 \text{ (meter/sec}^2)$

Can the ball move 0.1 meter in 0.1 seconds? Simple approximations give

$$\begin{aligned} x(t) &\approx \quad \frac{50}{7} \frac{t^2}{2} \phi_0 \approx 0.04 \phi_0 \\ \phi_0 &\approx \quad \frac{0.1}{0.04} = 2.5 \text{ radians} \end{aligned}$$

Clearly outside linear region!

Contact problem, friction, centripetal force, saturation

How fast can it be done? (Optimal control)

#### **Stability Can Depend on Amplitude**



Valve characteristic f(x) = ???

Step changes of amplitude, r = 0.2, r = 1.68, and r = 1.72

(t- au))

#### **Step Responses**



Stability depends on amplitude!

# **Stable Periodic Solutions**

Example: Motor with back-lash



Motor:  $G(s) = \frac{1}{s(1+5s)}$ Controller: K = 5

## **Relay Feedback Example**

Period and amplitude of limit cycle are used for autotuning



[patent: T Hägglund and K J Åström]

# **Jump Resonances**

 $u = 0.5 \sin(1.3t)$ , saturation level =1.0

Two different initial conditions



give two different amplifications for same sinusoid!



# **Stable Periodic Solutions**

Output for different initial conditions:



Frequency and amplitude independent of initial conditions! Several systems use the existence of such a phenomenon

# **Jump Resonances**



Response for sinusoidal depends on initial condition Problem when doing frequency response measurement

# **Jump Resonances**

Measured frequency response (many-valued)



#### **New Frequencies**



#### **New Frequencies**

Example: Mobile telephone

Effective amplifiers work in nonlinear region

Introduces spectrum leakage

Channels close to each other

Trade-off between effectivity and linearity



# When is Nonlinear Theory Needed?

- Hard to know when Try simple things first!
- Regulator problem versus servo problem
- Change of working conditions (production on demand, short batches, many startups)
- Mode switches
- Nonlinear components

How to detect? Make step responses, Bode plots

- Step up/step down
- Vary amplitude
- Sweep frequency up/frequency down

# 2 minute exercise

## **New Frequencies**

Example: Electrical power distribution

 $\mathsf{THD} = \mathsf{Total Harmonic Distortion} = \frac{\sum_{k=2}^{\infty} \mathsf{ energy in tone } k}{\mathsf{energy in tone } 1}$ 

Nonlinear loads: Rectifiers, switched electronics, transformers Important, increasing problem Guarantee electrical quality Standards, such as THD < 5%



#### Subresonances

**Example:** Duffing's equation  $\ddot{y} + \dot{y} + y - y^3 = a \sin(\omega t)$ 



# **Some Nonlinearities**



# Nonlinear Differential Equations

Problems

- No analytic solutions
- Existence?
- Uniqueness?
- etc

Construct a model for a "rate limiter" using some of the previous nonlinear blocks.

#### Existence Problems

#### Example: The differential equation

$$\frac{dx}{dt} = x^2, \qquad x(0) = x_0$$

has solution

$$x(t) = \frac{x_0}{1 - x_0 t}, \qquad 0 \le t < \frac{1}{x_0}$$

Finite escape time

$$t_f = \frac{1}{x_0}$$

# **Uniqueness Problems**

Example: The equation  $\dot{x} = \sqrt{x}$ , x(0) = 0 has many solutions:  $x(t) = \begin{cases} (t-C)^2/4 & t > C \\ 0 & t \le C \end{cases}$   $\int_{0}^{2} \int_{0}^{1} \int_$ 

 $dh/dt = -a\sqrt{h},$  h : height (water level) Change to backward-time: "If I see it empty, when was it full?")

# State-Space Models

- State vector x
- Input vector u
- Output vector y

general: explicit: affine in *u*: linear time-invariant:

 $f(x, u, y, \dot{x}, \dot{u}, \dot{y}, \ldots) = 0$  $\dot{x} = f(x, u), \quad y = h(x)$  $\dot{x} = f(x) + g(x)u, \quad y = h(x)$  $\dot{x} = Ax + Bu, \quad y = Cx$ 

#### **Finite Escape Time**



# **Existence and Uniqueness**

#### Theorem

Let  $\Omega_R$  denote the ball

$$\Omega_R = \{z; \|z - a\| \le R\}$$

If f is Lipschitz-continuous:

$$||f(z) - f(y)|| \le K ||z - y||,$$
 for all  $z, y \in \Omega$ 

then  $\dot{x}(t) = f(x(t)), x(0) = a$  has a unique solution in

$$0 \le t < R/C_R$$

where  $C_R = \max_{\Omega_R} \|f(x)\|$ 

# **Transformation to Autonomous System**

Nonautonomous:

$$\dot{x} = f(x, t)$$

Always possible to transform to autonomous system Introduce  $x_{n+1} = time$ 

$$\dot{x} = f(x, x_{n+1})$$
  
 $\dot{x}_{n+1} = 1$ 

# A Standard Form for Analysis

Transform to the following form



Assume  $\frac{d^k y}{dt^k}$  highest derivative of y

#### Example: Pendulum

 $MR^2\ddot{\theta}+k\dot{\theta}+MgR\sin\theta=0$ 

**Transformation to First-Order System** 

$$x = \begin{bmatrix} \theta & \dot{\theta} \end{bmatrix}^T$$
 gives

$$\dot{x}_1 = x_2$$
  
 $\dot{x}_2 = -\frac{k}{MR^2}x_2 - \frac{g}{R}\sin x_1$ 









Put all derivatives to zero!

General:  $f(x_0, u_0, y_0, 0, 0, 0, ...) = 0$ Explicit:  $f(x_0, u_0) = 0$ Linear:  $Ax_0 + Bu_0 = 0$  (has analytical solution(s)!)

# **Next Lecture**

 $\frac{-G}{1+CG}$ **Multiple Equilibria** 

Friction

Example: Pendulum

 $\Leftrightarrow$ 

$$MR^2\ddot{\theta} + k\dot{\theta} + MgR\sin\theta = 0$$

Equilibria given by  $\ddot{\theta} = \dot{\theta} = 0 \Longrightarrow \sin \theta = 0 \Longrightarrow \theta = n\pi$ Alternatively,

$$\dot{x}_1 = x_2$$
  
 $\dot{x}_2 = -\frac{k}{MR^2}x_2 - \frac{g}{R}\sin x_1$ 

gives  $x_2 = 0$ ,  $sin(x_1) = 0$ , etc

Linearization

- Stability definitions
- Simulation in Matlab