# Systems Engineering/Process control L5

- Impulse and step response
- Connection between transfer function and step response
- Nonlinear systems

Reading: Systems Engineering and Process Control: 5.1-5.3

# LTI systems – repetition (L3–L4)

#### State-space model

$$\begin{array}{c|c} u(t) \\ \hline x = Ax + Bu \\ y = Cx + Du \end{array} y(t)$$

System response:

$$\begin{aligned} x(t) &= e^{At} x(0) \\ &+ \int_0^t e^{A(t-\tau)} B u(\tau) \, d\tau \\ y(t) &= C x(t) + D u(t) \end{aligned}$$

Stability: Decided by eigenvalues of *A* 

#### Input-output model



System response:

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

Stability: Decided by poles to G(s)

#### Impulse response

- Suppose that the system is in equilibrium
- How does output react to input impulse (Dirac function)?



## Impulse response for linear systems

$$\delta(t)$$
  $G(s)$   $h(t)$ 

- **1**. Laplace transform input: U(s) = 1
- 2. Output becomes:

$$H(s) = G(s)U(s) = G(s)$$

3. Inverse transform gives impulse response:

$$h(t) = \mathcal{L}^{-1} \big\{ G(s) \big\}$$

h(t) also called weighting function

For a system on state-space for the impulse response becomes:

$$h(t) = Ce^{At}B + D\delta(t)$$

Stability notions (again):

- ▶ h(t) limited (except maybe at t = 0)  $\iff$  stable system
- $h(t) \rightarrow 0 \iff$  asymptotically stable system
- h(t) unlimited  $\iff$  unstable system

# Step response

- Suppose system in equilibrium
- How does the output change after step in input?



### Step response for linear systems

$$\begin{array}{c|c} 1 \\ \hline \\ G(s) \end{array} \begin{array}{c} y(t) \\ \hline \\ \end{array}$$

- 1. Laplace transform input:  $U(s) = \frac{1}{s}$
- 2. Output becomes:

$$Y(s) = G(s)U(s) = G(s)\frac{1}{s}$$

3. Inverse transformation gives step response:

$$y(t) = \mathcal{L}^{-1}\left\{G(s)\frac{1}{s}\right\} = \int_0^t h(\tau)d\tau$$

(The step response is the integral of the impulse response)

# Static gain

- Step response end value is called static gain of system
- Can be computed using the end value theorem:

$$Y(s) = G(s)\frac{1}{s}$$

$$\lim_{t\to\infty} y(t) = \lim_{s\to 0} sY(s) = \lim_{s\to 0} sG(s)\frac{1}{s} = G(0)$$

Note: Step response end value exists only for asymptotically stable systems!

# **Example: CSTR**



Volume V, flow q

- Reaction  $R \rightarrow P$
- Reaction rate k

Transfer function from  $c_{R,in}$  to  $c_P$ :

$$G(s) = \frac{\frac{q}{V}k}{(s + \frac{q}{V} + k)(s + \frac{q}{V})}$$

Static gain:

$$G(0) = \frac{\frac{q}{V}k}{\left(\frac{q}{V}+k\right)\frac{q}{V}} = \frac{1}{\frac{q}{kV}+1}$$

Interpretation: If  $c_{R,in}$  increases with 1,  $c_P$  increases with  $\frac{1}{\frac{q}{kV}+1}$  at equilibrium

System type:

- Integrator
- First order system
- Second order systems with real poles
- Second order systems with complex poles
- Systems with one zero
- Systems with time delays

# Integrating systems

$$G(s) = \frac{K}{s}$$

Example: Tank without free outflow:



Transfer function from  $q_{in}$  to h:

$$G(s) = \frac{1/A}{s}$$

# Integrating systems

Pole:

$$s = 0$$

Step response:

$$Y(s) = G(s)\frac{1}{s} = \frac{K}{s^2}$$

$$y(t) = Kt$$

No end value, since system is not asymptotically stable

# Integrating systems



#### 1st order systems

$$G(s) = \frac{K}{1+sT}, \quad T > 0$$

Example: Temperature dynamics in a tank:



Transfer function from  $\theta_0$  to  $\theta_1$ :

$$G(s) = \frac{1}{1 + s\frac{V}{q}}$$

#### 1:a order systems

Pole:

$$s = -1/T$$

Step response:

$$Y(s) = G(s)\frac{1}{s} = \frac{K}{s(1+sT)}$$
$$y(t) = K\left(1 - e^{-t/T}\right)$$

T is called time constant of the system

$$y(T) = (1 - e^{-1})K \approx 0.63K$$

#### 1:a order systems





Step response speed decided by distance from pole to origin

#### 2nd order systems with real poles

$$G(s) = rac{K}{(1+sT_1)(1+sT_2)}, \qquad T_1, T_2 > 0$$

Example: Temperature dynamics in coupled tanks:



Transfer function from  $\theta_0$  to  $\theta_2$ :

$$G(s)=rac{1}{ig(1+srac{V_1}{q}ig)ig(1+srac{V_2}{q}ig)}$$

#### 2:a order systems with real poles

Poles:

$$s = -1/T_1, \quad s = -1/T_2$$

Step response:

$$egin{aligned} Y(s) &= G(s)rac{1}{s} = rac{K}{s(1+sT_1)(1+sT_2)} \ y(t) &= egin{cases} K\left(1-rac{T_1e^{-t/T_1}-T_2e^{-t/T_2}}{T_1-T_2}
ight), & T_1 
eq T_2 \ K\left(1-e^{-t/T}-rac{t}{T}e^{-t/T}
ight), & T_1 = T_2 = T \end{aligned}$$

• Two time constants:  $T_1$ ,  $T_2$ 

# 2nd order systems with real poles

K = 1:



Two poles gives softer and slower response than single pole

• equivalent time constant:  $T_{eq} = T_1 + T_2$ 

If T<sub>1</sub> ≫ T<sub>2</sub> system behaves essentially as 1st order system with time constant T<sub>1</sub>

$$G(s) = \frac{K\omega_0^2}{s^2 + 2\zeta\omega_0 s + \omega_0^2},$$

$$\omega_0 > 0, \ 0 < \zeta < 1$$

- $\omega_0$  = undamped frequency
- $\zeta$  = relative damping

Example: Position dynamics for mechanical system



Transfer function from F to z:

$$G(s) = \frac{\frac{1}{m}}{s^2 + \frac{d}{m}s + \frac{k}{m}}$$

Complex poles if  $d < 2\sqrt{km}$ 





System speed decided by distance from poles to the origin



System damping decided by angle of the poles

# Systems with zeros

Suppose the system is given by

$$(1+T_z s)G_0(s)$$

- Zero in  $s = -\frac{1}{T_z}$
- Step response:

$$y(t) = \mathcal{L}^{-1}\left\{G_0(s)\frac{1}{s}\right\} + T_z \mathcal{L}^{-1}\{G_0(s)\}$$

- ► Weighted sum of impulse response and step response for G<sub>0</sub>(s)
- Big impact if zero close to the origin ( $T_z$  large)

# 2nd order systems with zeros

Example: 
$$G(s) = \frac{1 + sT_z}{(1 + 2s)^2}$$



Dashed step response for  $G_0(s) = \frac{1}{(1+2s)^2}$ 

- Zeros affect initial response
- R.h.p. zeros gives inverse response behavior initially

# Systems with time delay

Suppose the system is given by:

$$G(s) = G_0(s)e^{-sL}, \quad L > 0$$

• Step response for part without delay  $G_0(s)$ :

$$y_0(t) = \mathcal{L}^{-1}\left\{G_0(s)rac{1}{s}
ight\}$$

Step response with time delay:

$$y(t) = y_0(t - L)$$

 $(e^{-sL}$  cannot be interpreted with (finitely many) poles and zeros)

# Interpretation of poles and zeros

#### Poles

- Depends only on A-matrix, e.g., on system inner dynamics
- Decides system:
  - stability
  - speed
  - damping

#### Zeros

- Harder to interpret
- Depends on how inputs and outputs are connected to system (i.e., depends on B, C, and D matrices)
- A zero in s = a cancels the signal  $e^{at}$
- Influences mostly the initial step response behavior

Processes with:

- Poles in right half-plane (unstable)
  - ► The bigger the real part (> 0) the harder to control
- Zeros in right half-plane (reversed response initially)
  - ► The smaller real part (> 0) the harder to control
- Time delays
  - The longer time delay, the harder to control

# Processes that are impossible to control

Systems with poles and zeros in right half-plane (a, b > 0):

$$G(s) = \frac{Q(s)(s-a)}{P(s)(s-b)}$$

- If a = b: impossible to control
- If  $a \leq 3b$ : impossible to control in practice



#### **Examples**

# Bicycle with back wheel steering $a/b \approx 0.7$ at 1 m/s



X29,  $a/b \approx 4.33$ 



# **Nonlinear systems**

Different kinds of nonlinearities:

- Nonlinearities in actuators and sensors, e.g.,:
  - upper and lower limits on actuators and sensors
  - pumps and valves with nonlinear characteristics
  - friction and dead zones
  - nonlinear sensors for temperature, flow, concentration
- Nonlinear dynamics in the process, e.g.,:
  - level dependent outflow speed in a tank
  - temperature dependent reaction speed in reactor
  - population dependent rate of growth
- Nonlinearities in the controller, e.g.,:
  - on/off control

# **Example: Valve and pump characteristics**



Methods to compensate for nonlinearity:

- Compensate with table/mathematical function
- Feedback around static nonlinearity (better and more robust)

# Example: pH control

Want to control pH but measures concentration:



Can be compensated for with table/mathematical function

#### **Example: Logistic growth model**

$$\frac{dx}{dt} = rx\left(1 - \frac{x}{k}\right)$$

x = population, r = net growth rate, k = carrying capacity



#### **Example: Hares and Lynxes**

$$\begin{split} \frac{dH}{dt} &= rH\left(1-\frac{H}{k}\right) - \frac{aHL}{c+H}, \qquad H \geq 0, \\ \frac{dL}{dt} &= b\frac{aHL}{c+H} - dL, \qquad L \geq 0 \end{split}$$



#### Linear systems

- can equivalently be described with linear differential equation, state-space model, transfer function, impulse response, or step response
- are always in equilibrium at (x, u) = 0
- global analysis poles/zeros decide stability globally

Nonlinear systems

- described by nonlinear differential equation/state-space model
- can have many equilibria (stable/unstable) and limit cycles
- simulation, local analysis using linearization