



Linear Dynamical Systems

ELEC 3004: **Systems**: Signals & Controls
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Lecture 5

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Announcements:



- Assignment 1 is coming!
- Space Audit on **March 22** (F) and **March 28** (W)
 - P&F is going around in **black hats**
 - Sounds like an ideal time for a **pop-quiz**
 - Bring a friend or two (just saying ☺)



Today:

Week	Date	Lecture Title
1	27-Feb	Introduction
	1-Mar	Systems Overview
2	6-Mar	Signals & Signal Models
	8-Mar	System Models
3	13-Mar	Linear Dynamical Systems
4	15-Mar	Sampling & Data Acquisition
	20-Mar	Time Domain Analysis of Continuous Time Systems
5	22-Mar	System Behaviour & Stability
	27-Mar	Signal Representation
6	29-Mar	Holiday
	10-Apr	Frequency Response & Fourier Transform
7	12-Apr	Analog Filters
	17-Apr	IIR Systems
8	19-Apr	FIR Systems
	24-Apr	z-Transform
9	26-Apr	Discrete-Time Signals
	1-May	Discrete-Time Systems
10	3-May	Digital Filters
	8-May	State-Space
11	10-May	Controllability & Observability
	15-May	Introduction to Digital Control
12	17-May	Stability of Digital Systems
	22-May	PID & Computer Control
13	24-May	Information Theory & Communications
	29-May	Applications in Industry
	31-May	Summary and Course Review



Recall From Last Time ...

Linear Systems: The Concept Of Linearity

- Additivity

$$x_1 \rightarrow y_1 \quad \text{and} \quad x_2 \rightarrow y_2$$

$$x_1 + x_2 \rightarrow y_1 + y_2$$

- Homogeneity (scaling)

$$kx \rightarrow ky$$

- Superposition

$$k_1x_1 + k_2x_2 \rightarrow k_1y_1 + k_2y_2$$



Recall From Last Time ...

Classifications of Systems

1. Linear and nonlinear systems
2. Constant-parameter and time-varying-parameter systems
3. Instantaneous (memoryless) and dynamic (with memory) systems
4. Causal and noncausal systems
5. Continuous-time and discrete-time systems
6. Analog and digital systems
7. Invertible and noninvertible systems
8. Stable and unstable systems



Causality:

Causal (physical or nonanticipative) systems



- Is one for which the output at any instant t_0 depends only on the value of the input $x(t)$ for $t \leq t_0$. Ex:

$$u(t) = x(t - 2) \Rightarrow \text{causal}$$

$$u(t) = x(t - 2) + x(t + 2) \Rightarrow \text{noncausal}$$

- A “*real-time*” system must be causal
 - How can it respond to future inputs?
- A prophetic system: knows future inputs and acts on it (now)
 - The output would begin before t_0
- In some cases Noncausal may be modelled as causal with delay
- Noncausal systems provide **an upper bound** on the performance of causal systems



Causality:

Looking at this from the output's perspective...

- **Causal** = The output *before* some time t does not depend on the input *after* time t .

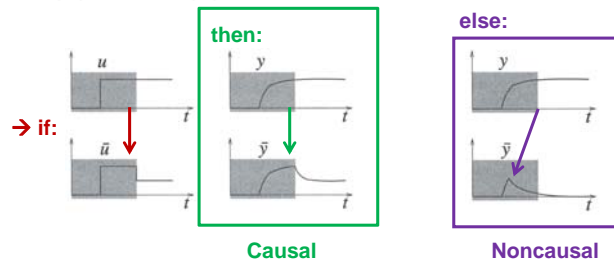
Given: $y(t) = F(u(t))$

For:

$$\hat{u}(t) = u(t), \forall 0 \leq t < T \text{ or } [0, T)$$

Then for a $T > 0$:

$$\rightarrow \hat{y}(t) = y(t), \forall 0 \leq t < T$$

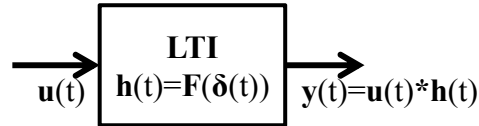


Dynamical Systems...

- A system with a memory
 - Where past history (or derivative states) are **relevant** in determining the response
- Ex:
 - RC circuit: Dynamical
 - Clearly a function of the “capacitor’s past” (initial state) and
 - Time! (charge / discharge)
 - R circuit: is memoryless \because the output of the system (recall $V=IR$) at some time t only depends on the input at time t

- Lumped/Distributed
 - Lumped: Parameter is constant through the process & can be treated as a “point” in space
- Distributed: System dimensions \neq small over signal
 - Ex: waveguides, antennas, microwave tubes, etc.

Linear Time Invariant



- Linear & Time-invariant (of course - tautology!)
- Impulse response: $\mathbf{h(t)=F(\delta(t))}$
- Why?
 - Since it is linear the output response (\mathbf{y}) to any input (\mathbf{x}) is:

$$x(t) = \int_{-\infty}^{\infty} x(\tau) \delta(t - \tau) d\tau$$

$$y(t) = F \left[\int_{-\infty}^{\infty} x(\tau) \delta(t - \tau) d\tau \right] \xrightarrow{\text{linear}} \int_{-\infty}^{\infty} x(\tau) F[\delta(t - \tau)] d\tau$$

$$h(t - \tau) \stackrel{TI}{=} F[\delta(t - \tau)]$$

$$\Rightarrow y(t) = \int_{-\infty}^{\infty} x(\tau) h(t - \tau) d\tau = x(t) * h(t)$$

- The output of any continuous-time LTI system is the **convolution** of input $\mathbf{u(t)}$ with the impulse response $\mathbf{F(\delta(t))}$ of the system.



Linear Dynamic [Differential] System

≡ LTI systems for which the input & output are linear ODEs

$$a_0 y + a_1 \frac{dy}{dt} + \dots + a_n \frac{d^n y}{dt^n} = b_0 x + b_1 \frac{dx}{dt} + \dots + b_m \frac{d^m x}{dt^m}$$

Laplace:

$$a_0 Y(s) + a_1 s Y(s) + \dots + a_n s^n Y(s) = b_0 X(s) + b_1 s X(s) + \dots + b_m s^m X(s)$$

$$A(s)Y(s) = B(s)X(s)$$

- Total response = Zero-input response + Zero-state response

Initial conditions

External Input



Linear Systems and ODE's

- Linear system described by differential equation

$$a_0 y + a_1 \frac{dy}{dt} + \dots + a_n \frac{d^n y}{dt^n} = b_0 x + b_1 \frac{dx}{dt} + \dots + b_m \frac{d^m x}{dt^m}$$

- Which using Laplace Transforms can be written as

$$a_0 Y(s) + a_1 s Y(s) + \dots + a_n s^n Y(s) = b_0 X(s) + b_1 s X(s) + \dots + b_m s^m X(s)$$

$$A(s)Y(s) = B(s)X(s)$$

where $A(s)$ and $B(s)$ are polynomials in s



Unit Impulse Response



- $\delta(t)$: Impulsive excitation
- $h(t)$: characteristic mode terms

Ex:

EXAMPLE 2.4
 Determine the unit impulse response $h(t)$ for a system specified by the equation

$$(D^2 + 3D + 2)y(t) = Dx(t) \quad (2.25)$$

This is a second-order system ($N=2$) having the characteristic polynomial $(\lambda^2 + 3\lambda + 2) = (\lambda + 1)(\lambda + 2)$. The characteristic roots of this system are $\lambda = -1$ and $\lambda = -2$. Therefore

$$y_h(t) = c_1 e^{-t} + c_2 e^{-2t} \quad (2.26a)$$

Differentiation of this equation yields

$$\dot{y}_h(t) = -c_1 e^{-t} - 2c_2 e^{-2t} \quad (2.26b)$$

The initial conditions are [see Eq. (2.24b) for $N=2$]
 $y_h(0) = 1$ and $\dot{y}_h(0) = 0$

Setting $t=0$ in Eqs. (2.26a) and (2.26b), and substituting the initial conditions just given, we obtain

$$0 = c_1 + c_2$$

$$1 = -c_1 - 2c_2$$

Solution of these two simultaneous equations yields

$$c_1 = 1 \quad \text{and} \quad c_2 = -1$$

Therefore

$$y_h(t) = e^{-t} - e^{-2t}$$

Moreover, according to Eq. (2.25), $P(D) = D$, so that $P(D)y_h(t) = D y_h(t) = \dot{y}_h(t) = -e^{-t} + 2e^{-2t}$

Also in this case, $b_0 = 0$ [the second-order term is absent in $P(D)$]. Therefore

$$h(t) = [P(D)y_h(t)]u(t) = (-e^{-t} + 2e^{-2t})u(t)$$


System Models

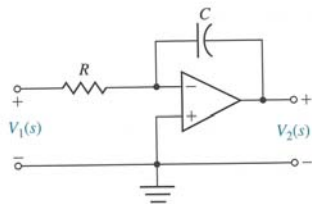
- Various things – all the same!

Table 2.1 Summary of Through- and Across-Variables for Physical Systems

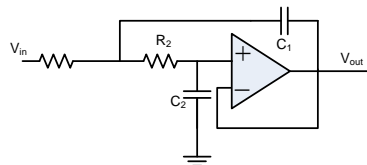
System	Variable Through Element	Integrated Through-Variable	Variable Across Element	Integrated Across-Variable
Electrical	Current, i	Charge, q	Voltage difference, v_{21}	Flux linkage, λ_{21}
Mechanical translational	Force, F	Translational momentum, P	Velocity difference, v_{21}	Displacement difference, y_{21}
Mechanical rotational	Torque, T	Angular momentum, h	Angular velocity difference, ω_{21}	Angular displacement difference, θ_{21}
Fluid	Fluid volumetric rate of flow, Q	Volume, V	Pressure difference, P_{21}	Pressure momentum, γ_{21}
Thermal	Heat flow rate, q	Heat energy, H	Temperature difference, \mathcal{T}_{21}	



Circuits



$$\frac{V_2(s)}{V_1(s)} = -\frac{1}{RCs}$$

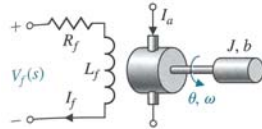


$$\frac{v_{out}}{v_{in}} = \frac{1}{C_1 C_2 R_1 R_2 s^2 + C_2 (R_1 + R_2) s + 1}$$



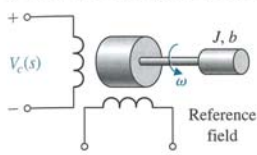
Motors

5. DC motor, field-controlled, rotational actuator



$$\frac{\theta(s)}{V_f(s)} = \frac{K_m}{s(Js + b)(L_f s + R_f)}$$

7. AC motor, two-phase control field, rotational actuator



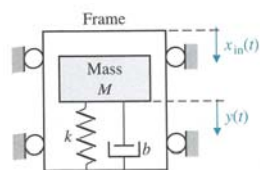
$$\frac{\theta(s)}{V_c(s)} = \frac{K_m}{s(\tau s + 1)}$$

$$\tau = J/(b - m)$$

m = slope of linearized torque-speed curve (normally negative)

Mechanical Systems

15. Accelerometer, acceleration sensor



$$x_o(t) = y(t) - x_{in}(t),$$

$$\frac{X_o(s)}{X_{in}(s)} = \frac{-s^2}{s^2 + (b/M)s + k/M}$$

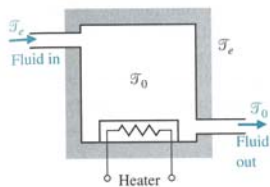
For low-frequency oscillations, where

$$\omega < \omega_n,$$

$$\frac{X_o(j\omega)}{X_{in}(j\omega)} \approx \frac{\omega^2}{k/M}$$

Thermal Systems

16. Thermal heating system



$$\frac{\mathcal{T}(s)}{q(s)} = \frac{1}{C_t s + (QS + 1/R_i)}, \text{ where}$$

$\mathcal{T} = \mathcal{T}_0 - \mathcal{T}_e =$ temperature difference due to thermal process

$C_t =$ thermal capacitance

$Q =$ fluid flow rate = constant

$S =$ specific heat of water

$R_i =$ thermal resistance of insulation

$q(s) =$ transform of rate of heat flow of heating element



First Order Systems

First order systems

$$ay' + by = 0 \quad (\text{with } a \neq 0)$$

righthand side is zero:

- called *autonomous system*
- solution is called *natural* or *unforced response*

can be expressed as

$$Ty' + y = 0 \quad \text{or} \quad y' + ry = 0$$

where

- $T = a/b$ is a *time* (units: seconds)
- $r = b/a = 1/T$ is a *rate* (units: 1/sec)



First Order Systems

Solution by Laplace transform

take Laplace transform of $Ty' + y = 0$ to get

$$T \underbrace{(sY(s) - y(0))}_{\mathcal{L}(y')} + Y(s) = 0$$

solve for $Y(s)$ (algebra!)

$$Y(s) = \frac{Ty(0)}{sT + 1} = \frac{y(0)}{s + 1/T}$$

and so $y(t) = y(0)e^{-t/T}$



First Order Systems

solution of $Ty' + y = 0$: $y(t) = y(0)e^{-t/T}$

if $T > 0$, y decays exponentially

- T gives time to decay by $e^{-1} \approx 0.37$
- $0.693T$ gives time to decay by half ($0.693 = \log 2$)
- $4.6T$ gives time to decay by 0.01 ($4.6 = \log 100$)

if $T < 0$, y grows exponentially

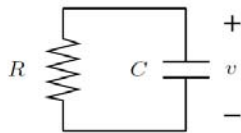
- $|T|$ gives time to grow by $e \approx 2.72$;
- $0.693|T|$ gives time to double
- $4.6|T|$ gives time to grow by 100



First Order Systems

Examples

simple RC circuit:



circuit equation: $RCv' + v = 0$

solution: $v(t) = v(0)e^{-t/(RC)}$

population dynamics:

- $y(t)$ is population of some bacteria at time t
- growth (or decay if negative) rate is $y' = by - dy$ where b is birth rate, d is death rate
- $y(t) = y(0)e^{(b-d)t}$ (grows if $b > d$; decays if $b < d$)



Second Order Systems

Second order systems

$$ay'' + by' + cy = 0$$

assume $a > 0$ (otherwise multiply equation by -1)

solution by Laplace transform:

$$a \underbrace{(s^2 Y(s) - sy(0) - y'(0))}_{\mathcal{L}(y'')} + b \underbrace{(sY(s) - y(0))}_{\mathcal{L}(y')} + cY(s) = 0$$

solve for Y (just algebra!)

$$Y(s) = \frac{asy(0) + ay'(0) + by(0)}{as^2 + bs + c} = \frac{\alpha s + \beta}{as^2 + bs + c}$$

where $\alpha = ay(0)$ and $\beta = ay'(0) + by(0)$



Second Order Systems

so solution of $ay'' + by' + cy = 0$ is

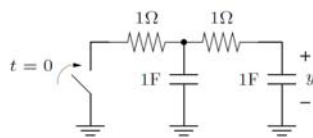
$$y(t) = \mathcal{L}^{-1} \left(\frac{\alpha s + \beta}{as^2 + bs + c} \right)$$

- $\chi(s) = as^2 + bs + c$ is called *characteristic polynomial* of the system
- form of $y = \mathcal{L}^{-1}(Y)$ depends on roots of characteristic polynomial χ
- coefficients of numerator $\alpha s + \beta$ come from initial conditions



Ex: RC Circuit

Example: second-order RC circuit



at $t = 0$, the voltage across each capacitor is 1V

- for $t \geq 0$, y satisfies LCCODE (from page 2-18)

$$y'' + 3y' + y = 0$$

- initial conditions:

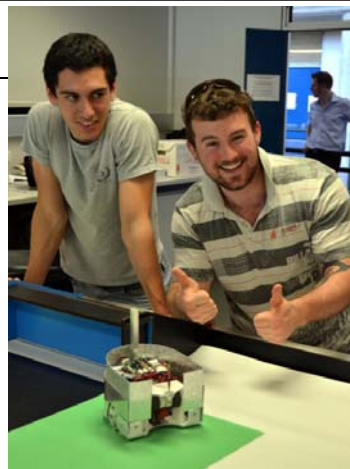
$$y(0) = 1, \quad y'(0) = 0$$

(at $t = 0$, voltage across righthand capacitor is one; current through righthand resistor is zero)



Optical Flow Experiments

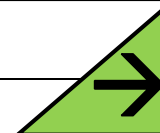
- Adam is still looking for volunteers
- For those signed up
 - **Please** reply to his email
- Additional times are available:
 - Thursday 3p-5p
 - Friday 10a-12n



Come Go With The Flow!



Next Time...



- Sampling
 - Measurements at regular intervals of a continuous signal
 - Not to be confused with
“ How to try regional dishes without indigestion”
- Review:
 - Chapter 8 of Lathi
- Send (and you shall receive) a positive signal ☺

