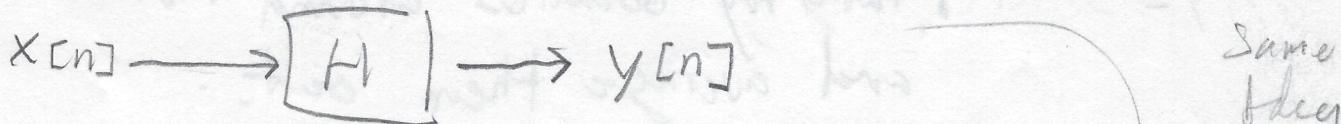
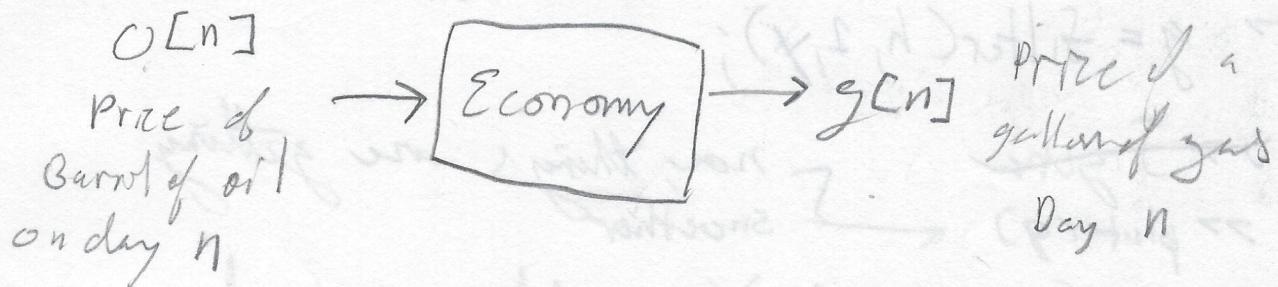
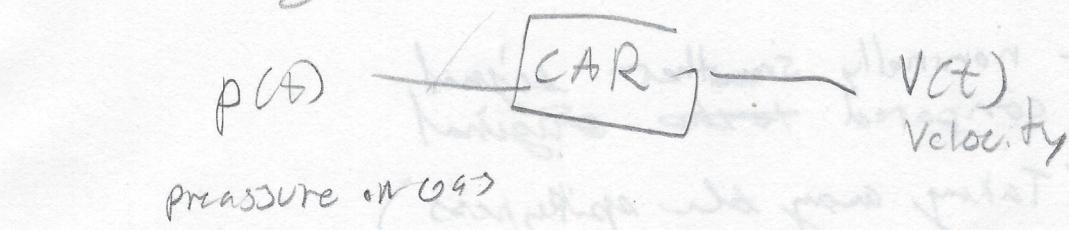


DSP Lecture 2

(1)

Linear, time-invariant systems
systems process signals to create other signals.



$$x[n] \rightarrow y[n], \quad y[n] = H(x[n])$$

The entries of $y[n]$ as function of the entries of $x[n]$.

Ex

$$y[n] = \sum_{k=-2}^2 x[n-k]$$

$$= y_5 [x[n+2] + x[n+1] + x[n] + x[n-1] + x[n-2]]$$

→ moving avg filter.

② matLab

```
>>x=rand(1,300);  
>>close all  
>>plot(x) % Noisy signal  
>>h=[111 11]/5  
>>y=filter(h,1,x);  
>>figure  
>>plot(y) ← nominally smoother signal  
           compared to the original  
(Taking away the spikiness)  
>>g=filter(h,1,y);  
>>figure now things are getting  
>>plot(g) ← smoother  
>>y=filter Take my bubbles around me  
           and average them out.
```

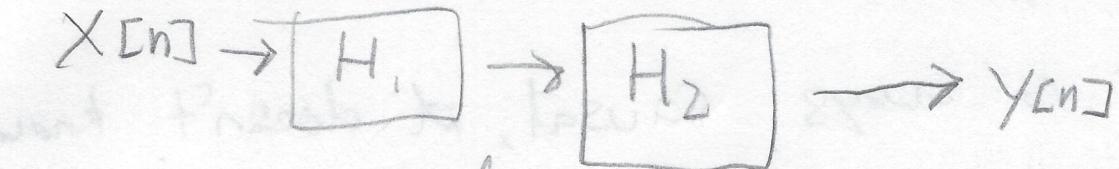
systems described by Differential equations

$$y'(t) + ay(t) = bX(t)$$

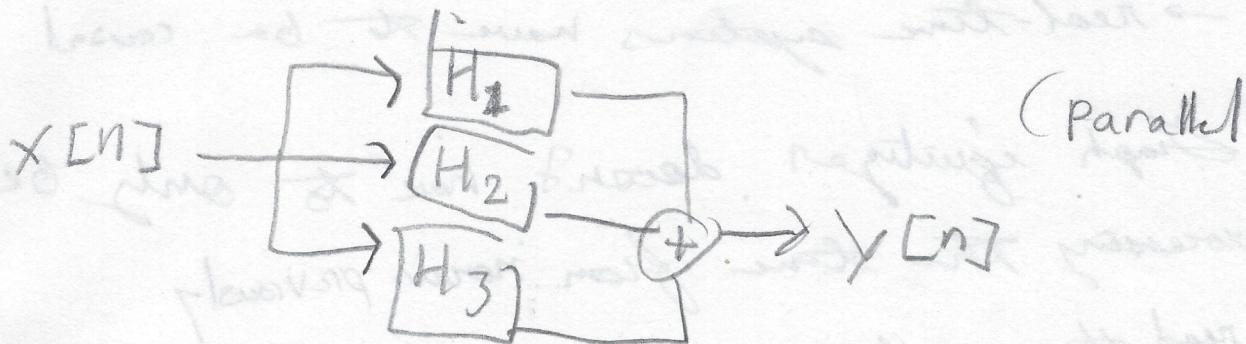
difference equation in discrete (arise from elec.
and mechanized problems)

$$y[n] + ay[n-1] = bX[n]$$

Connected systems

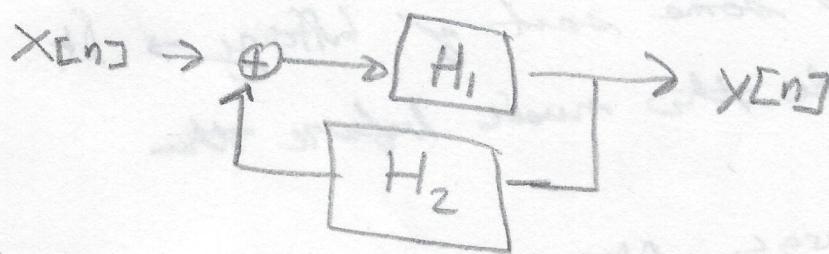


serial, cascade



(parallel)

Feed back system



10:29

Cruise control on car

- input: gas pedal
- output: Feed it back into input

System Properties

1) causality, A system is causal if the output at time n only depends on the input to time n ,

$$Y[n] = x[n] - 2x[n-1] \leftarrow \text{causal}$$

$$Y[n] = x[n+3] \leftarrow \text{Not causal} \quad \begin{matrix} \text{(Something} \\ \text{exists before)} \\ n=0 \end{matrix}$$

does some future time appear in the equation for the system?

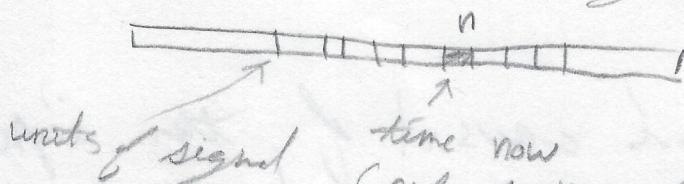
④

Is every real world system causal?

- Car is always causal, it doesn't know when you are going to steer or whatever.
- real-time systems have to be causal
- Graph equalizer doesn't have to only be processing the time from now, previously.
→ read the signal into memory and process it into the future → there is some sort of buffering → It makes sure to provide the music before the listener hears it.

Not causal : Image processing

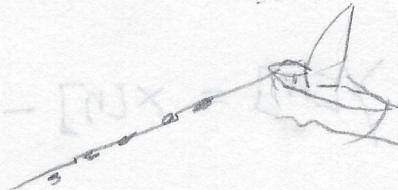
→ 1 dimensional signal



time now
Only looking at this point and previous ones

→ This is causal

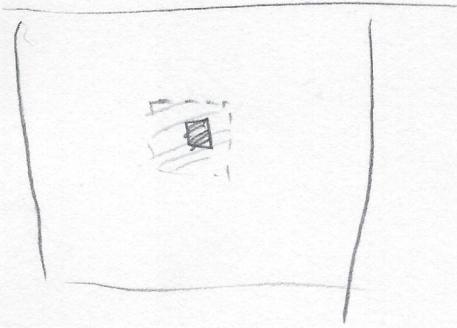
by that those signal samples came from a boat strung along a bunch of sensors



there a natural order of the sensors (sequence), but at the data is retrieved at the same time (can be processed at once)

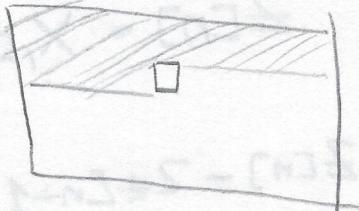
Think about an Image

(5)



Take the pixel of interest
then average it with its
neighbours

→ if causal, then we could only focus on the pixels (neighbours) before getting to the pixels of interest.



nothing from the future can be seen, but n can be constrained in such a way

2) first property: Linearity

sum of two signals

$$x_1 \rightarrow y_1, x_2 \rightarrow y_2$$

$$x_1[n] + x_2[n] \rightarrow [H] \rightarrow y_1[n] + y_2[n]$$

→ System is linear → additivity

$$\alpha x_1[n] \rightarrow [H] \rightarrow \alpha y_1[n]$$

Homogeneity So then

system acting proportionally
on input

$$\alpha x_1[n] + b x_2[n] \rightarrow [H] \rightarrow \alpha y_1[n] + b y_2[n]$$

must be true

(b) not all systems are linear
 → find a linear system that's close to the system we have.

Ex $y[n] = x[n] - 2x[n-1]$

$$x_1[n] \rightarrow x_1[n] - 2x_1[n-1] = y_1[n]$$

$$x_2[n] \rightarrow x_2[n] - 2x_2[n-1] = y_2[n]$$

what is the response of

$$z[n] = x_1[n] + x_2[n]?$$

$$z[n] \rightarrow [H] \rightarrow z[n] - 2z[n-1]$$

$$= (x_1[n] + x_2[n]) - 2(x_1[n-1] + x_2[n-1])$$

$$= (x_1[n] - 2x_1[n-1]) + (x_2[n] - 2x_2[n-1])$$

$$= y_1[n] + y_2[n]$$

verified additivity.

$$z[n] = ax_1[n]$$

$$z[n] \rightarrow [H] \rightarrow az[n]$$

$$\rightarrow z[n] - 2az[n-1]$$

$$ax_1[n] - 2ax_1[n-1] = a(x_1[n] - 2x_1[n-1])$$

Homogeneity

confirmed

$$a(x_1[n] - 2x_1[n-1])$$

$$D \rightarrow d + [n] \times D \leftarrow [H] \leftarrow D \rightarrow d + [n] \times D$$

All at once

(7)

$$z[n] = ax_1[n] + bx_2[n]$$

$$z[n] \rightarrow [H] \rightarrow z[n] - z[n-1]$$

$$= ax_1[n] + bx_2[n] - 2(ax_1[n-1] + bx_2[n-1])$$

$$= a(x_1[n] - 2x_1[n-1]) \quad \text{they only affect the } n^{\text{th}}$$

$$+ b(x_2[n] + 2x_2[n-1])$$

$$= ay_1[n] + by_2[n] \quad \text{Linear!}$$

$$y[n] = 3x[n] + 5$$

Linear or not Linear?

$$x_1[n] \rightarrow 3x_1[n] + 5$$

$$x_2[n] \rightarrow 3x_2[n] + 5$$

→ check additivity

$$z[n] = x_1[n] + x_2[n]$$

$$z[n] \rightarrow [H] \rightarrow 3z[n] + 5 = 3(x_1[n] + x_2[n]) + 5$$

$$\neq (3x_1[n] + 5) + (3x_2[n] + 5)$$

→ not linear

If something's linearity is in question, provide a counter example. If one property fails, then the whole thing is proven non-linear.

⑥ counter Ex

$$x_1[n] = 1, x_2[n] = 2 \quad \text{if linear, 2 is twice 1}$$

$$y_1[n] = 8, \quad y_2[n] = 11 \quad \begin{matrix} \rightarrow \\ \text{for linearity} \rightarrow \text{Not the case} \end{matrix}$$

→ use constants or delta functions

Linear system must be Homogeneous

$$ax_i[n] \rightarrow ay_i[n] \quad \text{for any constant } a \in \mathbb{C}$$

$$\text{as in } 0 \rightarrow 0$$

Q: must a be real? $a \in \mathbb{C}$? x_p ?

Time invariance

System behaves the same way regardless of when input is applied

$$x[n] \rightarrow \square \rightarrow y[n]$$

$$x[n-n_0] \rightarrow \square \rightarrow y[n-n_0]$$

There are non-time invariant things
→ Like the speed it takes to download something

at 3pm vs 12am

(9)

$$Y[n] = X[n] - 2X[n-1] \quad \text{Time invariant?}$$

$$Z[n] = X[n-n_0]$$

$$Z[n] \rightarrow \square \rightarrow Z[n] - 2Z[n-1]$$

$$= X[n-n_0] - 2X[n-1-n_0]$$

$$= X[n-n_0] ?$$

To

see if this checks, look at $\underline{Y[n]}$

$$\rightarrow \text{plug in } X[n-n_0]$$

So then

$$Y[n-n_0]$$

$$\text{So } Y[n-n_0] = X[n-n_0] - 2X[n-n_0-1]$$

Time invariance holds

System is linear.

Consider:

$$Y[n] = X[n^2]$$

$$Z[n] = X[n-n_0]$$

$$Z[n] \rightarrow \square \rightarrow Z[n^2] = X[n^2-n_0]$$

(That, only n^2 affected) Z is it equivalent to

$$Y[n-n_0] ?$$

$$Y[n-n_0] = X[(n-n_0)^2] \neq Z[n^2]$$

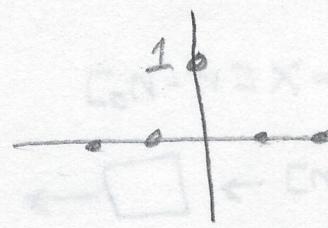
NOT time invariant

For counter examples, try $\delta[n]$

(10)

$$Y[n] = X[n^2]$$

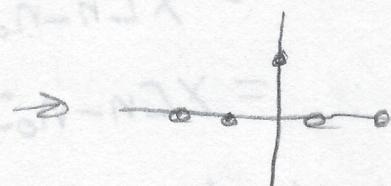
response to $X[n] = \delta[n]$



$$Y[0] = X[0]$$

$$Y[1] = Y[-1] = X[1]$$

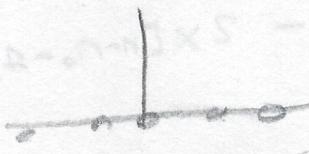
$$Y[2] = Y[-2] = X[2]$$



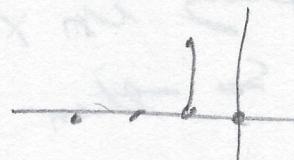
(think: plotting the response)

Response to $X[n] = \delta[n+1]$

$$Y[n]$$



(think: n is always positive
due to n^2)



This demonstration shows not
the-invariant

Linear, Time-invariant Systems (LTI)

→ Assume systems of interest are all LTI

Real-world systems are often modeled as LTI
(Good approx.)

a) after a good approx

b) Analysis is easy/powerful

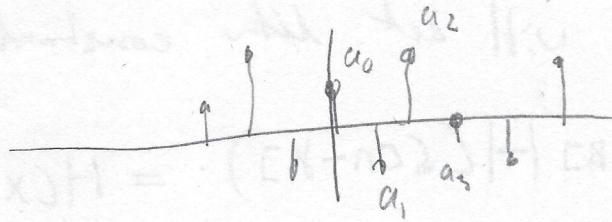
(1)

Key concept/ Superposition

$$a_0 x[n] + a_1 x[n-1] + a_2 x[n-2] + \dots \rightarrow \boxed{\text{LTI}}$$

$$\Rightarrow a_0 y[n] + a_1 y[n-1] + a_2 y[n-2] + \dots$$

consider an arbitrary signal



this looks like

$$\begin{matrix} a_0 \\ \downarrow \end{matrix} + \begin{matrix} a_1 \\ \downarrow \end{matrix} + \begin{matrix} a_2 \\ \downarrow \end{matrix} + \dots$$

$$= \left(\begin{matrix} \downarrow \\ 1 \end{matrix} \right) a_0 + \left(\begin{matrix} \downarrow \\ 1 \end{matrix} \right) a_1 + \left(\begin{matrix} \downarrow \\ 1 \end{matrix} \right) a_2$$

$$= a_0 (\delta[n]) + a_1 (\delta[n-1]) + a_2 (\delta[n-2]) + \dots$$

so we can say

$$x[n] = \sum_{k=-\infty}^{\infty} x[k] s[n-k] \quad \begin{array}{l} \text{"sifting" property} \\ \text{of } s \text{ function} \end{array}$$

"non-zero at $k=n$ "

what happens when we put this signal

through the system

(12)

LTI ~~sys~~ System Impulse response

$$S[n] \rightarrow [H] \rightarrow h[n]$$

What is the response to $x[n]$?

$$H(x[n]) = H\left(\sum_{k=-\infty}^{\infty} x[k] \delta[n-k]\right)$$

 $x[k]$ will act like constants

By linearity,

$$\sum_{k=-\infty}^{\infty} x[k] H(\delta[n-k]) = H(x[n])$$

(Take constants
out of sum)

P/ Time - Invariance

$$\sum_{k=-\infty}^{\infty} x[k] h[n-k] = H(x[n])$$

So $H(x[n]) = x[n] * h[n] = y[n]$

(impulse response) Input impulse response

Fully characterises
the system

output