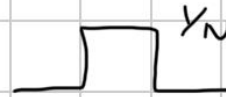
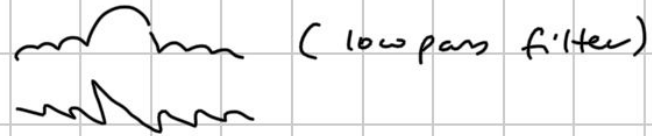


Start w/ Discrete Time (D.T.) Moving Average (FIR)

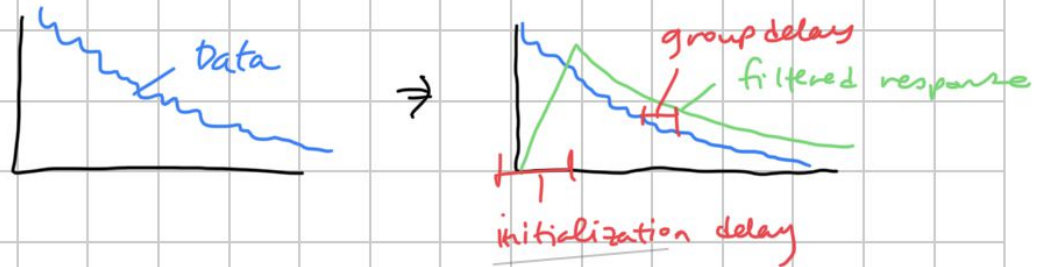
rectangular-like in time



sinc-like in frequency



moving average smooths out your data curve



Some problems: ① group delays (larger filter order  $N$ )  
 $\Rightarrow$  longer group delay =  $\frac{N-1}{2}$

② initialization delay (also dependent on filter order  $N$ )

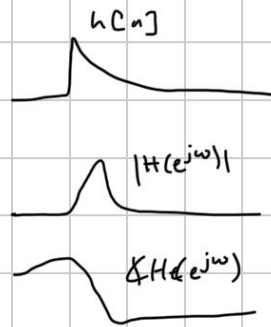
③ all values weighted equally (bad if your data changes frequently)

in a time sensitive system, large group delay can be disastrous  
 (i.e. landing a plane,  
 procedure to shut down refinery,  
 safety mechanisms...)

what about alternatives?

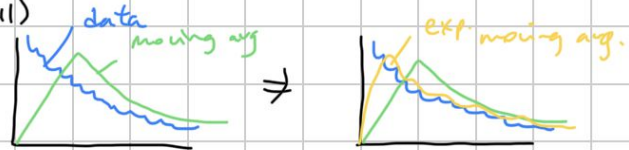
## Exponential Moving Avg.

system exponential in time



★  $\Rightarrow$  no longer linear group delay!!

also smooths out data (not as well) but has SHORTER delay!



but! is this feasible?  $\Rightarrow$  non-linear phase

$$h[n] = 0.9^n u[n]$$

$$y[n] = x[n] + 0.9 y[n-1]$$

$$Y(z) = X(z) + 0.9 Y(z) z^{-1} \Rightarrow H(z) = \frac{1}{1 - 0.9 z^{-1}}$$

can we go  $H(z) \rightarrow H(e^{j\omega})$ ?

Yes! (check if  $|z| < 1$ )

$\left[ \text{so we can obtain } H(z) \rightarrow H(e^{j\omega}) \right]$

$\swarrow$

so, this is a valid filter!

★ but, it is IIR filter (b/c  $H(z)$ ,  $H(e^{j\omega})$ ,  $h[n]$ )

depends on current / previous INPUT & previous OUTPUT!!)

(FIR only depend only current / previous INPUTS)

## General Form of IIR Filter

$$y[n] = \sum_{i=0}^N b_i \cdot x[n-i] - \sum_{i=1}^N a_i \cdot y[n-i]$$

coefficients for current & previous inputs

current & previous inputs

coefficients for previous outputs

previous outputs

$$H(z) = \frac{1 + \sum_{i=0}^N b_i \cdot z^{-i}}{1 - \sum_{i=1}^N a_i \cdot z^{-i}}$$

check slides for exact/correct notation!!

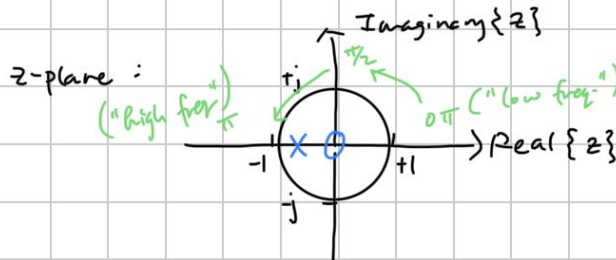
# 1st Order IIR Filters

(demonstration @ 10:50 is AM)

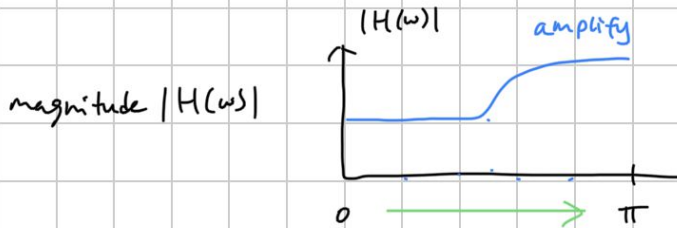
$$H(z) = \frac{1}{1+0.9z^{-1}}$$

zero: @  $z_0 = 0$

pole: @  $p_0 = -0.9$



$0\pi$  or  $2\pi \Rightarrow$  low frequencies  
 $\pi \Rightarrow$  high frequencies



$\Rightarrow$  no need to plot 2nd half ( $\pi \rightarrow 2\pi$  freqs.)

(if) z-plane is symmetric about x-axis.

**zeros:** will attenuate nearby freqs.

**poles:** will amplify nearby freqs.

$\Rightarrow$   $\star$  the closer a pole / zero is to the unit circle, the more effect the pole / zero has on nearby frequencies (pole amplify more, zero attenuate more)

$\Rightarrow$   $\star$  the further away a pole / zero is to unit circle, the less effect it has on nearby frequencies (pole amplify less, zero attenuate less)

what if we have some  $H(z)$  that is NOT or marginally stable?

$\Rightarrow$  we would NOT call  $H(z)$  a filter, but we might say, for example, this  $H(z)$  has behaviour of low pass filter.

⇒ @ 10:50 - 11 AM, highly recommend to watch demonstration of Designing different kinds of IIR filters. (1<sup>st</sup> order)

★ (note: 1<sup>st</sup> order IIR filter ⇒ you have 1 pole, 1 zero to design your filters)

⇒ @ 11 AM, highly recommend to watch demo on 2<sup>nd</sup> Order Filter (IIR)  
Second Order Biquad

$$H(z) = \frac{b_0 + b_1 z^{-1} + b_2 z^{-2} + \dots + b_N z^{-N}}{1 + a_1 z^{-1} + \dots + a_N z^{-N}} = \dots \quad \left. \vphantom{H(z)} \right\} \text{Direct Form}$$

$$H(z) = \underbrace{H_1(z) \cdot H_2(z) \cdot \dots \cdot H_{N/2}(z)}_{\text{cascading biquads}} \rightarrow \text{cascade of biquads form}$$

$$\text{where } H_i(z) = \frac{b_0 + b_1 z^{-1} + b_2 z^{-2}}{1 + a_1 z^{-1} + a_2 z^{-2}} = c \frac{\overbrace{(z - z_1)(z - z_2)}^{\text{complex conjugates}}}{\underbrace{(z - p_1)(z - p_2)}_{\text{complex conjugates}}} \quad \left. \vphantom{H_i(z)} \right\} \text{a biquad}$$

same filter, same filter order. why do Direct Form or Cascade of Biquads?

⇒ Direct form is easiest to implement

⇒ Biquads have better stability in terms of magnitude response

as IIR filter order  $N \rightarrow \infty$

↳ we can leverage complex conjugate symmetry in each biquad.

⇒ in each biquad, it is made of

complex conjugate pairs of zeros & poles

↳ nice because your  $z$ -plane is symmetric.

(easy to see/analyze design of filter)

(break @ 11:12 AM)

⇒ return @ 11:18 AM

@ 11:18) demo of IIR filter implementation (Vocoder - "voice encoder")

@ 11:27) discussion of Chromagram application of IIR