## **ELEC-A7200**

### **Signals and Systems**

Professor Riku Jäntti Fall 2022





### Lecture 10 Linear filters

## **Linear filters**

## The term "filter" typically refer to a continuous-time circuit that is designed to remove certain frequencies and allow others to pass.

First order Butterworth filter and its Bode plot







## **Operation principle of a filter**



## **Ideal filters**

• Low-pass filter



A

f



• High-pass filter



• Band-stop filter



Passband



## **Ideal filters**

Ideal filter would not cause phase and amplitude distortions on the pass-band and completely reject the stop-band:

- **Pass-band:** A(f)=A and  $\phi(f)=2\pi ft_d$
- Stop-band: A(f)=0



Ideal band-pass filter



## **Ideal filters**

Ideal low-pass filter

$$H(f) = \operatorname{rect}\left(\frac{f}{2B}\right)e^{-i2\pi ft_d}$$

#### Impulse response

$$h(t) = F^{-1}\left\{H(f)\right\} = 2BA\operatorname{sinc}\left(2B(t-t_d)\right)$$

Is not causal unless the delay caused by the filter becomes infinite  $t_d \rightarrow \infty$ 

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## **Uncertainty principle**

## A function [signal] and its Fourier transform cannot both be localized.

Consider an energy signal x(t) with unit energy  $\int_{-\infty}^{\infty} |x(t)|^2 dt = 1$ 

Its dispersion in the time and frequency domain fulfill

$$\int_{-\infty}^{\infty} t^2 |x(t)|^2 dt \int_{-\infty}^{\infty} f^2 |X(f)|^2 df \ge \frac{1}{16\pi^2}$$

This bound resembles the Heisenberg's uncertainty principle in quantum physics.



## **Practical filters**

Practical filter is characterized by

- Filter order (order of the LTI system realizing the filter)
- Pass-band and pass band ripple  $\Delta A_p$
- Transition region, roll of rate, and shape factor
- Stop-band and selectivity  $\Delta A_e$





## Filter shape factor

- Typically we want the transition region to be narrow.
- Filter shape factor describes the relative width of the transition band







## **Example: RC Filter**

#### **Frequency transfer function** $H(f) = \frac{1}{j2\pi fT + 1}$

#### **Amplitude function**

 $A(f) = |H(f)| = \frac{1}{\sqrt{(2\pi fT)^2 + 1}}$ 

#### Half-power (-3 dB) bandwidth :

 $A^{2}(f) = |H(f)|^{2} = \frac{1}{(2\pi fT)^{2} + 1} = \frac{1}{2} \Rightarrow f = \frac{1}{2\pi T} = B_{-3 \ dB}$ 

#### -60 dB bandwidth:

 $A^{2}(f) = |H(f)|^{2} = \frac{1}{(2\pi fT)^{2} + 1} = 10^{-6} \implies f = \frac{\sqrt{10^{6} - 1}}{2\pi T} = B_{-60 \ dB}$ 



Selectivity  $r = \frac{B_{-60 \ dB}}{B_{-3 \ dB}} = \sqrt{10^6 - 1} \approx 1000$ 



# Example 2: Two RC Filters in series

**Frequency transfer function**  $H(f) = \frac{1}{(j2\pi fT + 1)^2}$ 

**Amplitude function** 

 $A(f) = |H(f)| = \frac{1}{(2\pi fT)^2 + 1}$ 

#### Half-power (-3 dB) bandwidth :

$$A^{2}(f) = |H(f)|^{2} = \frac{1}{\left((2\pi fT)^{2} + 1\right)^{2}} = \frac{1}{2} \Rightarrow f = \frac{\sqrt{\sqrt{2} - 1}}{2\pi T} = B_{-3 \ dB}$$

#### -60 dB bandwidth:

$$A^{2}(f) = |H(f)|^{2} = \frac{1}{\left((2\pi fT)^{2}+1\right)^{2}} = 10^{-6} \Rightarrow f = \frac{\sqrt{10^{3}-1}}{2\pi T} = B_{-60 \ dB}$$



Filter time constant T = RC

Selectivity  $r = \frac{B_{-60 \ dB}}{B_{-3 \ dB}} = \frac{\sqrt{10^3 - 1}}{\sqrt{\sqrt{2} - 1}} \approx 49.1$ 



# Example: 1<sup>st</sup> and 2<sup>nd</sup> order RC filters



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## **Filter families**

- There are four classic analogue filter types:
  - Butterworth: Flattest pass-band but a poor roll-off rate.
  - Chebyshev: Some pass-band ripple but a better (steeper) roll-off rate.
  - Elliptic (aka Cauer): Some pass- and stopband ripple but with the steepest roll-off rate.
  - Bessel: Worst roll-off rate of all four filters but the best phase response. Filters with a poor phase response will react poorly to a change in signal level.





## **Butterworth filter**

#### Transfer function of nth order Butterworh filter

 $\widehat{H}(s) = \frac{1}{\prod_{k=1}^{n} (s - p_k)} \qquad p_k = \sqrt[n]{1} = \sqrt[n]{e^{j2\pi k}} = e^{jk2\pi \frac{k}{n}} \\ \text{Re}\{s_k\} < 0$ 

#### Rescale to get desirable bandwith W

s:=s/(2πW)

#### **Amplitude function**



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N	Transfer Function
2	$\frac{1}{s^2 + 1.414s + 1}$
3	$\frac{1}{(s+1)(s^2+s+1)}$
4	$\frac{1}{(s^2 + 0.7654s + 1)(s^2 + 1.8478s + 1)}$
5	$\frac{1}{(s+1)(s^2+0.6180s+1)(s^2+1.6180s+1)}$
6	$\frac{1}{(s^2+0.5176s+1)(s^2+1.4142s+1)(s^2+1.9318s+1)}$
7	$\frac{1}{(s+1)(s^2+0.4450s+1)(s^2+1.2480s+1)(s^2+1.8019s+1)}$
8	$\frac{1}{(s^2 + 0.3902s + 1)(s^2 + 1.1111s + 1)(s^2 + 1.6629s + 1)(s^2 + 1.9616s + 1)}$

## **Butterworth filters**



Group delay





## Filter design example

#### Filter specifications for a subwoofer Butterworth filter





## Filter design example

- 1. Fix pass-band attenuation  $20\log_{10}A(80) = -3 \text{ dB}$  $\Rightarrow A(80) = \frac{1}{\sqrt{\left(\frac{80}{W}\right)^{2n} + 1}} = 10^{-\frac{3}{20}} \Rightarrow \left(\frac{80}{W}\right)^{2n} = 10^{\frac{3}{10}} - 1$
- 3. Solve filter order





- 2. Fix stop-band attenuation  $20\log_{10}A(160) = -24 \text{ dB}$  $\Rightarrow A(160) = \frac{1}{\sqrt{\left(\frac{160}{W}\right)^{2n} + 1}} = 10^{-\frac{24}{20}} \Rightarrow \left(\frac{160}{W}\right)^{2n} = 10^{\frac{24}{10}} - 1$
- 4. Make either pass-band cutoff frequency exact and solve for W.

$$W = \frac{80}{\left(\frac{3}{10^{\frac{3}{10}} - 1}\right)^{\frac{1}{8}}} \approx 80.05$$
  
or

$$W = \frac{160}{\left(10^{\frac{24}{10}} - 1\right)^{\frac{1}{8}}} \approx 80.23$$

## Filter design example

#### Designed 4<sup>th</sup> order filter





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## **Digital filters**

Digital Infinite impulse response (IIR) vs Finite Impulse Response (FIR) Filters

- Analog filters can be translated to IIR filters by discretizing.
- IIR filters are less sensitive to quantization errors than FIR filters and use less memory (have lower delay).
- FIR filters can be designed to have linear phase response



Infinite impulse response (IIR) filter



Finite impulse response (FIR) filter



## **Digital IIR filter example**

#### **Example 3<sup>rd</sup> order Butterworth filter. Sampling frequency 10Hz**





## **Digital FIR filter example**

## Several methods to design FIR filters exists. One is to approximate given ideal frequency response









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