

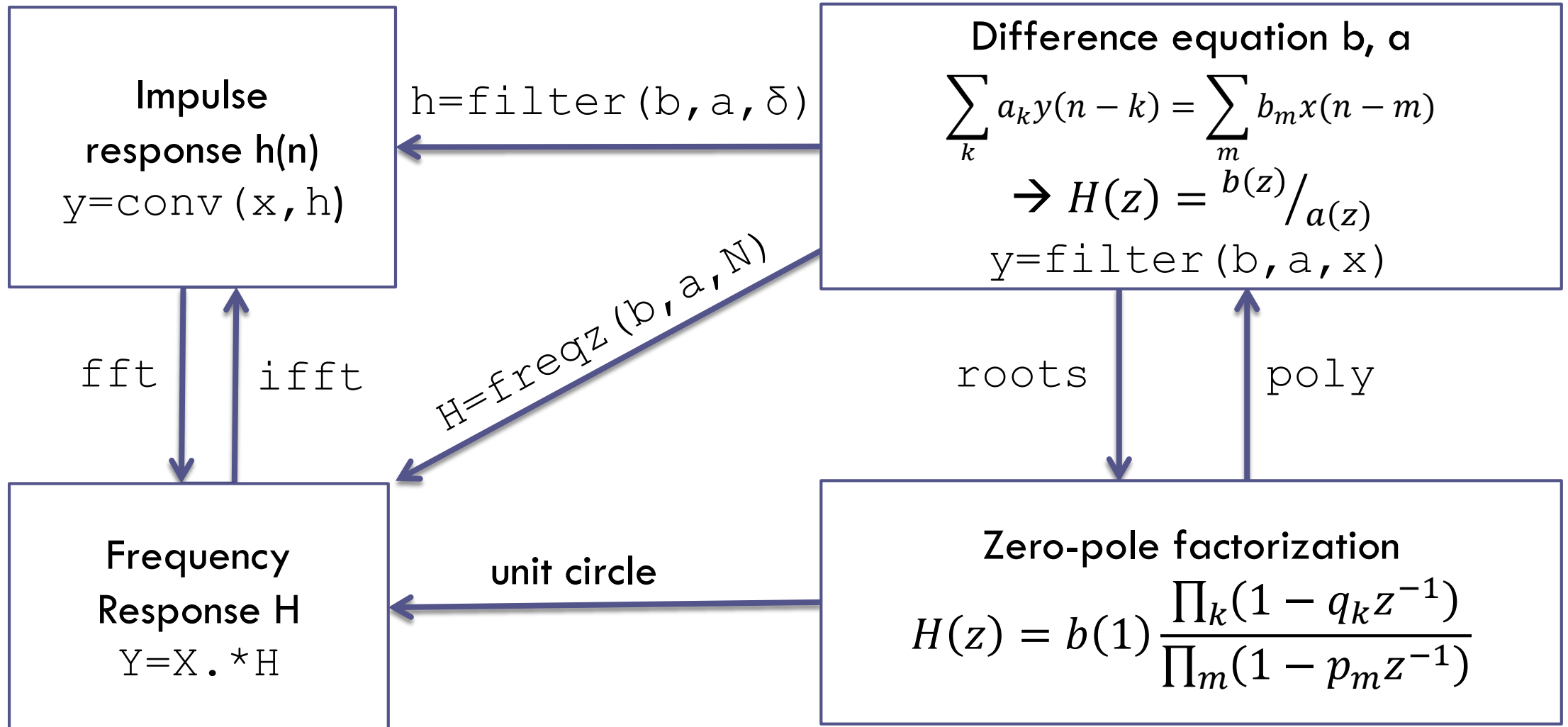
DIGITAL FILTERS

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Filter characterization

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Filter characterization

- `h=filter(b,a,δ)` → `length(h)=length(δ)`
- `H=fft(h,N)` (`h=ifft(H,N)`) computes (requires) the frequency components from 0 to 2π
- `[H,f]=freqz(b,a,N)` computes the frequency components from 0 to π → symmetry properties
- Estimate H on the unit circle:

```
f=linspace(0,pi,N+1); f=f(1:end-1);  
z=roots(b); p=roots(a);  
H=b(1)*prod((1-z*exp(-1i*f')),1)/...  
    prod((1-p*exp(-1i*f')),1);  
H=H.';
```

Filter characterization

- See MATLAB code "DigitalFilters".

Filters

- The amplitude of the response is **enhanced** in the frequency components near the **poles**
 - ▣ Poles are the infinite-impulse response (IIR) component of the filter
 - ▣ If not properly placed, they can make the system **unstable**
- The amplitude of the response is **reduced** in the frequency components near the **zeros**
 - ▣ Zeros are the finite-impulse response (FIR) component of the filter
- **Let's write a function** `show_filter(z, p)` that shows:
 - ▣ on the left subplot the zplane
 - ▣ on the right subplot the transfer function (see `plotyy`)

Filters

This function plots a filter, given its zeros and poles

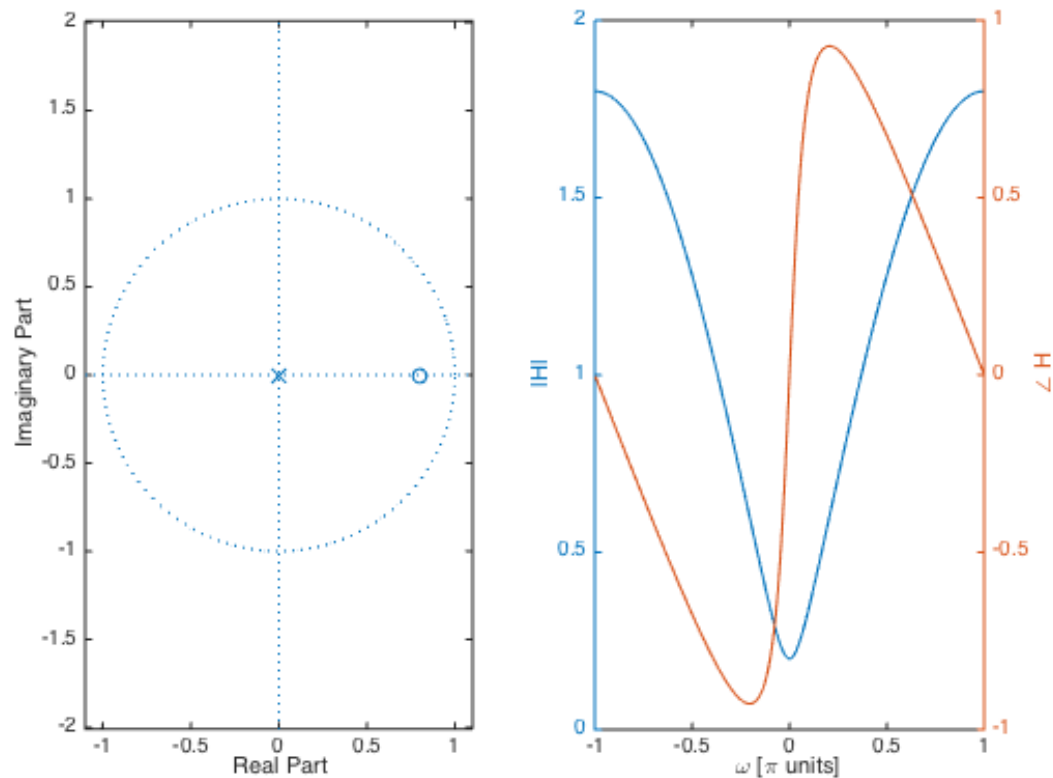
```
function [ ] = show_filter( z,p )
    a=poly(p); b=poly(z); [H, f]=freqz(b,a);
    f=[-flipud(f(2:end))];f]/pi;
    H=[flipud(conj(H(2:end)))];H];
    figure; subplot(1,2,1); zplane(b,a);
    subplot(1,2,2);
    [ax,p1,p2] = plotyy(f,abs(H),f,angle(H));
    ylabel(ax(1),'|H|'); % label left y-axis
    ylabel(ax(2),'angle H'); % right y-axis
    xlabel(ax(1),'omega [\pi units]');
    xlabel(ax(2),'omega [\pi units]');
end
```

Filters

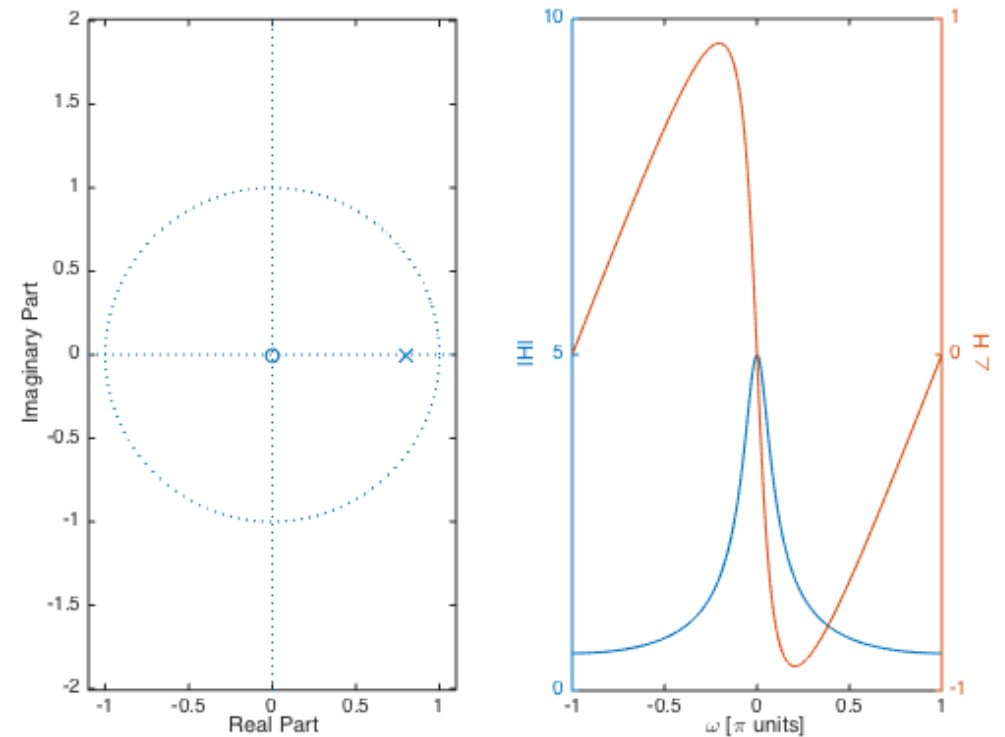
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One zero-filter with $z_1=0.8$
high-pass filter



One pole-filter with $p_1=0.8$
low-pass filter

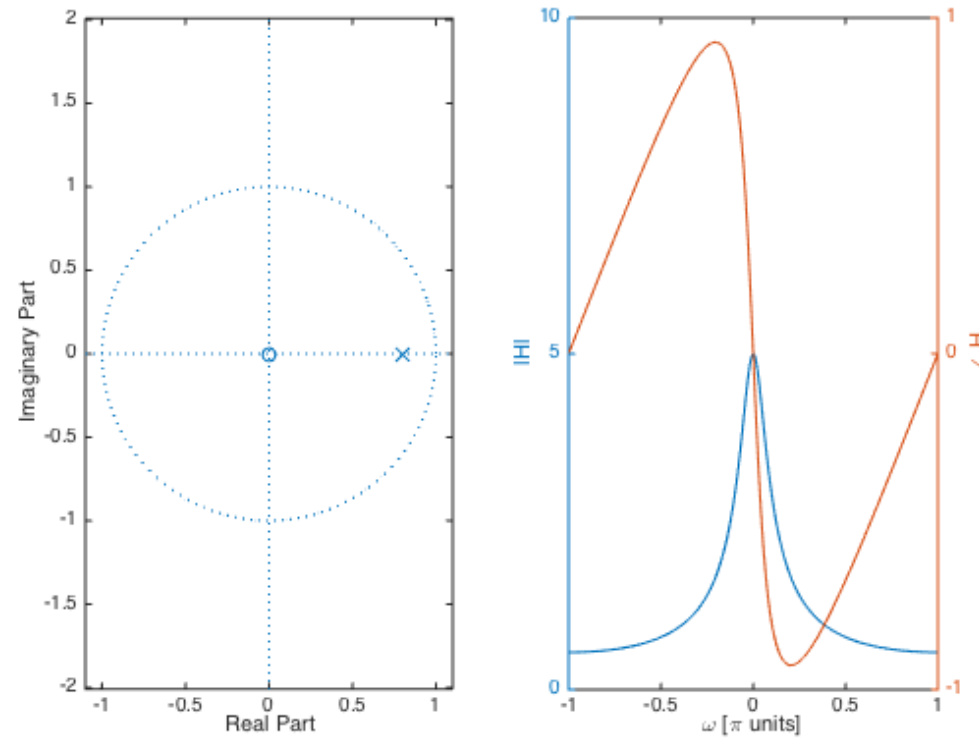


Filters

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- One pole-filter with $p_1=0.8$: low-pass filter



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Filter design

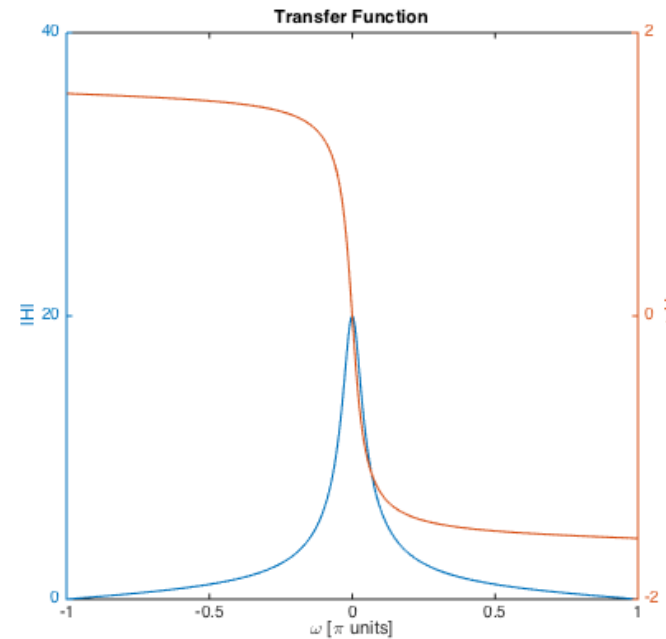
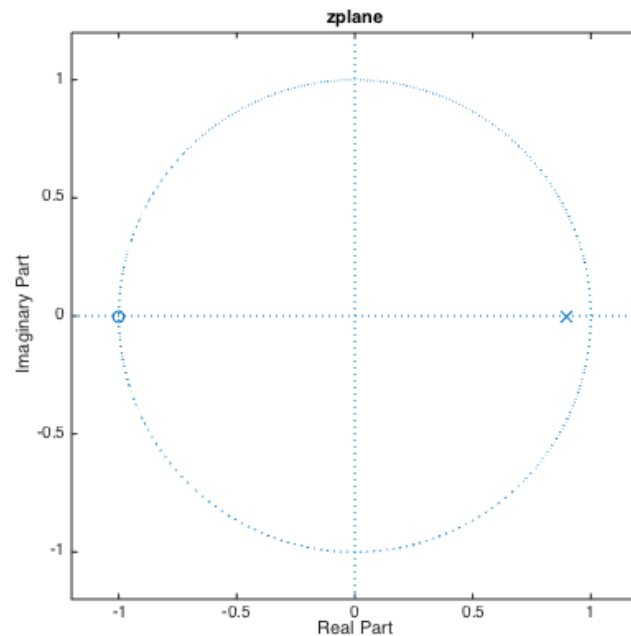
Filters

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□ Lowpass filter

- ▣ Zeros close to $\omega=\pi \rightarrow -1$
- ▣ Poles close to $\omega=0 \rightarrow 0.9$ (inside the unit circle!)
- ▣ $H(z)=(1+z^{-1})/(1-0.9z^{-1})$



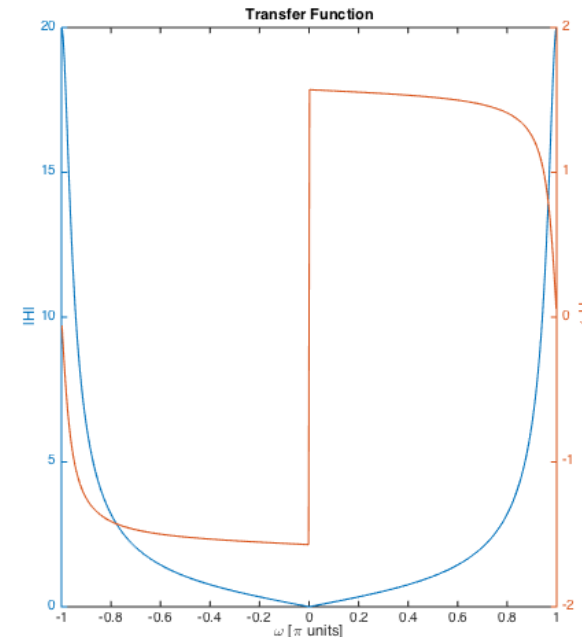
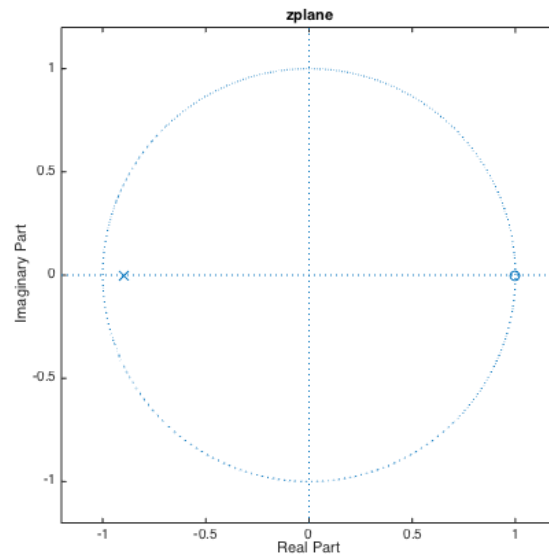
Filters

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□ Highpass filter

- ▣ Zeros close to $\omega=0 \rightarrow 1$
- ▣ Poles close to $\omega=\pi \rightarrow -0.9$ (inside the unit circle!)
- ▣ $H(z)=(1-z^{-1})/(1+0.9 z^{-1})$

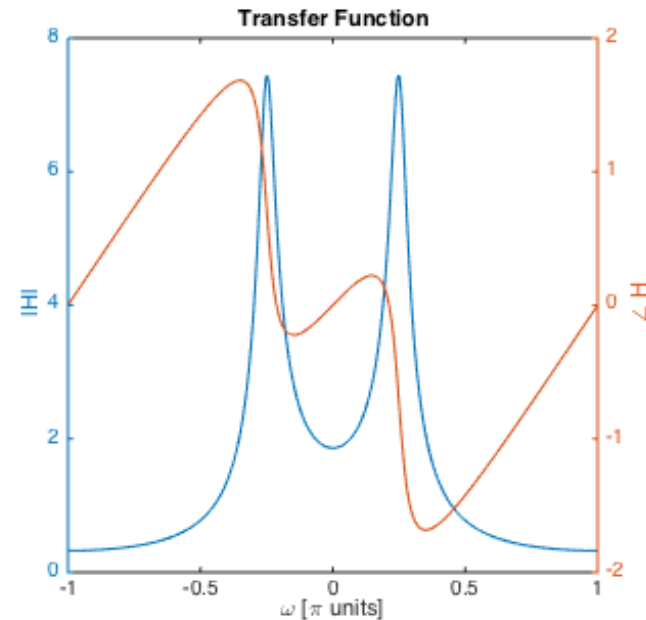
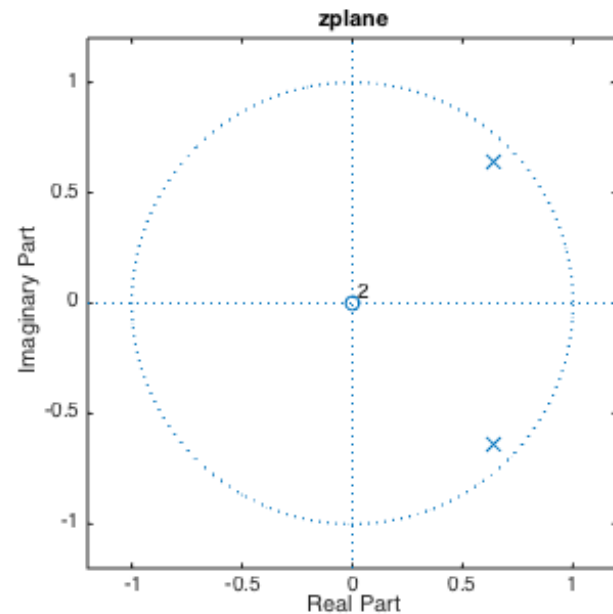


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- Bandpass filter (on frequency ϕ)
 - ▣ No zeros
 - ▣ Poles close to $\omega=\phi \rightarrow \rho e^{\pm i\phi}$ ($\rho < 1$)
 - ▣ $H(z) = 1 / [(1 - \rho e^{i\phi} z^{-1}) (1 - \rho e^{-i\phi} z^{-1})]$

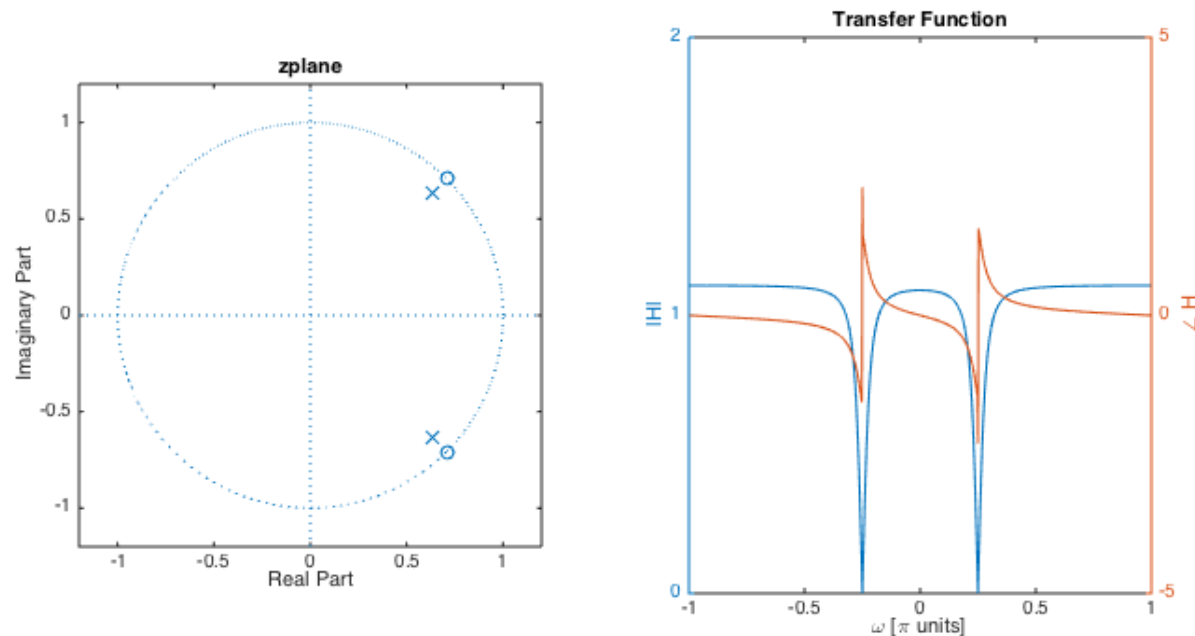


Filters

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- Stopband (notch) filter (on frequency ϕ)
 - ▣ Zeros at $\omega=\phi \rightarrow e^{\pm i\phi}$
 - ▣ Poles close to $\omega=\phi \rightarrow \rho e^{\pm i\phi}$ ($\rho < 1$)
 - ▣ $H(z) = [(1 - e^{i\phi} z^{-1})(1 - e^{-i\phi} z^{-1})] / [(1 - \rho e^{i\phi} z^{-1})(1 - \rho e^{-i\phi} z^{-1})]$



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Minimum Phase Filters

Minimum phase filters

- A LTI filter $H(z)=B(z)/A(z)$ is called "minimum phase filter" if all of its poles and zeros are inside the unit circle
 - ▣ poles \rightarrow the filter is stable
 - ▣ zeros \rightarrow the inverse filter $H^{-1}=A(z)/B(z)$ is stable
- Given a second order LTI filter $H(z)=B(z)/A(z)$
 - ▣ $B=[1,c]$
 - ▣ $A=[1 -a -b]$
- Let's find a, b, c that implement a minimum phase filter

Minimum phase filters

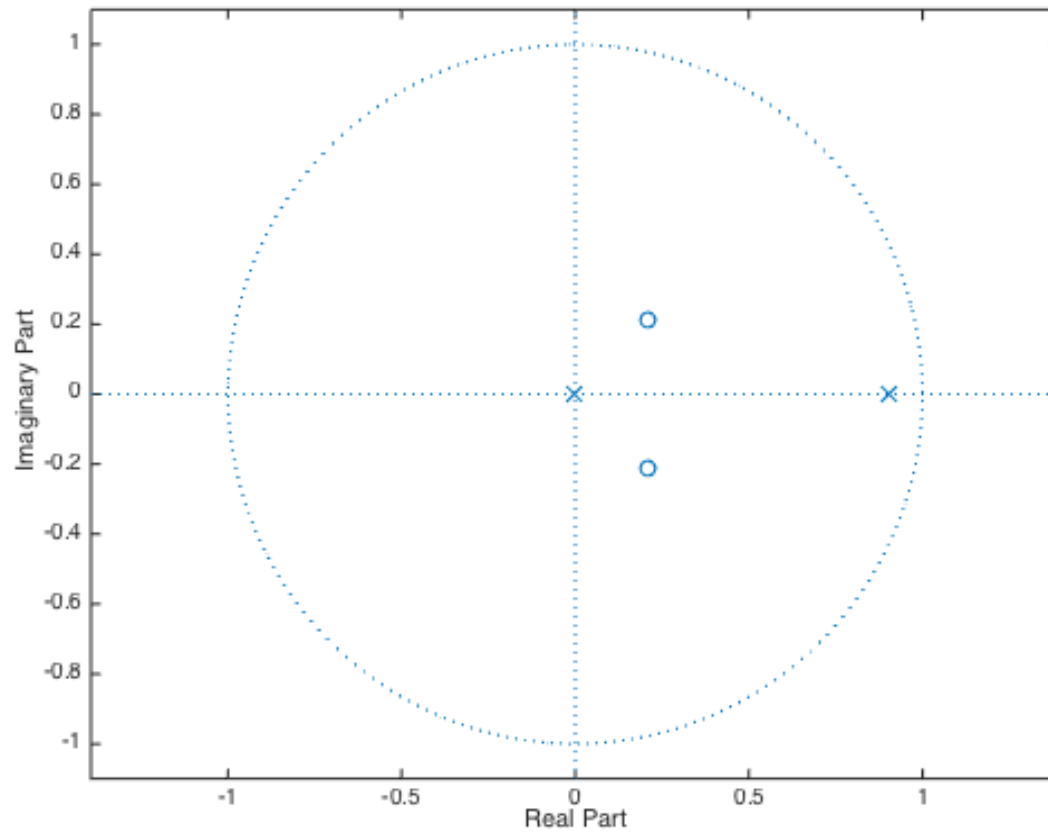
- $-c$ is the zero $\rightarrow |c| < 1$
- $1 - az^{-1} - bz^{-2} = 0 \rightarrow (p_1 z^{-1} - 1)(p_2 z^{-1} - 1) = 0$
 - ▣ $1 - (p_1 + p_2)z^{-1} + (p_1 p_2)z^{-2} = 0 = 1 - az^{-1} - bz^{-2}$
 - ▣ $p_1 + p_2 = a$
 - ▣ $-p_1 p_2 = b$
- Choose $|p_1| < 1, |p_2| < 1$

```
z1=0.9; c=-z1;  
p1=0.3.*exp(1i*pi/4); p2=conj(p1);  
a=p1+p2; b=-p1*p2;  
A=[1 c]; B=[1, -a, -b];  
figure; zplane(B,A);
```


Minimum phase filters

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Allpass Filter

Allpass filter

- An allpass filter passes all frequencies with equal gain:
 $|H(\omega)| = \text{constant}$
- Given the denominator difference equation $a(n)$, with poles p_1, p_2, p_3, \dots

- ▣ $b(n)$ must have zeros at $z_b = 1/p_b^*$

```
rho=0.8; phi=0.3*pi; p1=rho*exp(1i*phi);  
p=[p1, conj(p1)]; z=1./conj(p);
```

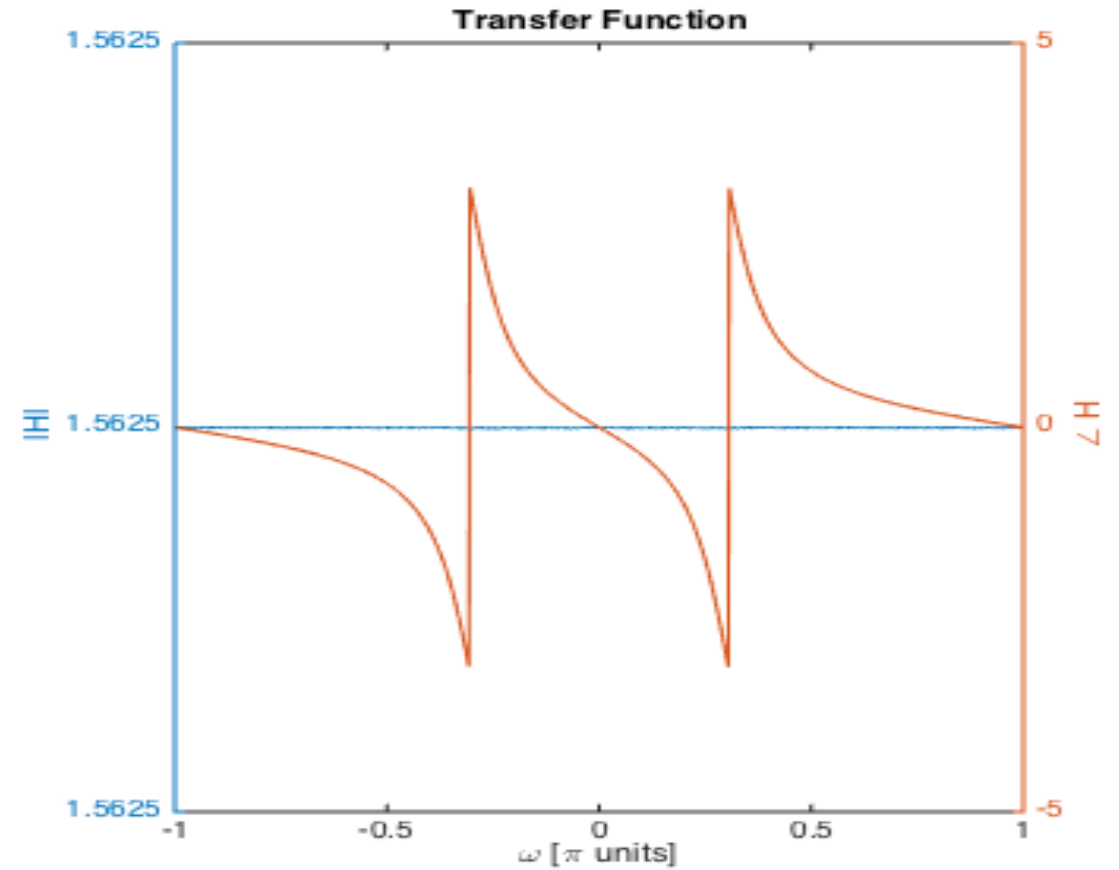
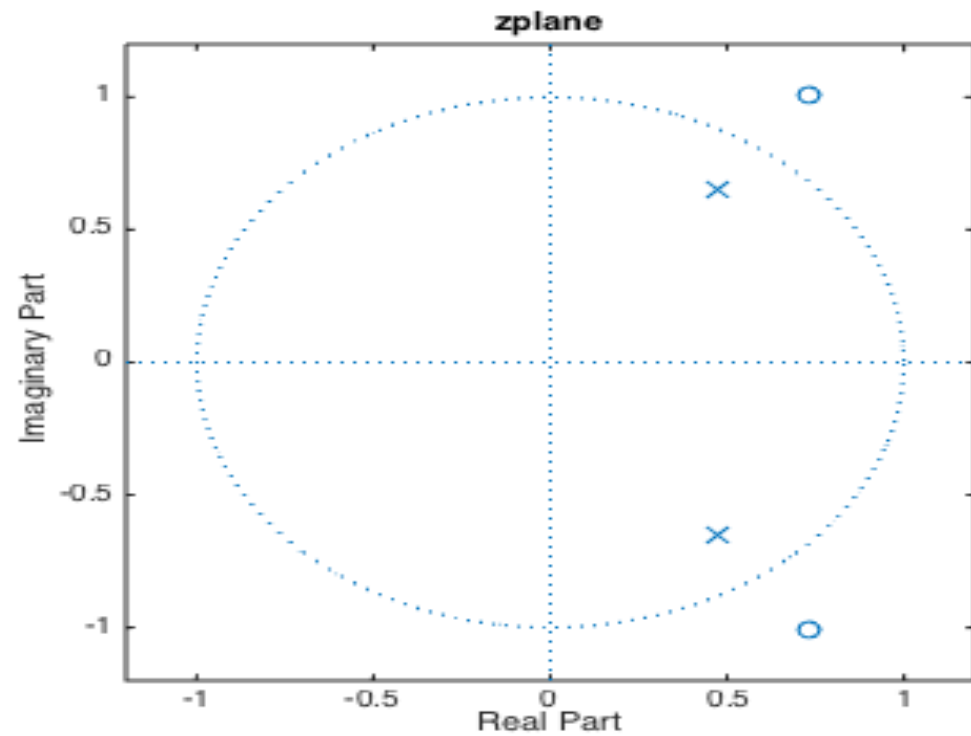
- ▣ $b_i(n) = a_{N-i}^* \rightarrow$ conjugated and folded version of $a(n)$

```
a=poly(p); b=flip1r(conj(a));
```

Allpass filter

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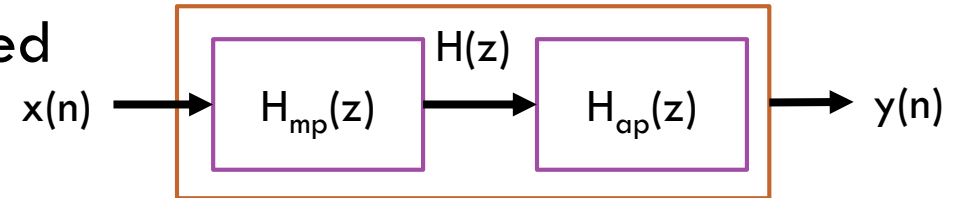
Minimum-phase and allpass decomposition

Minimum phase/allpass decomposition

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- A causal **stable** filter $H(z)$ can always be decomposed into its minimum phase $H_{mp}(z)$ and allpass $H_{ap}(z)$ components



- Assumption: $H(z)$ is **stable** \rightarrow poles p are all in the unit circle

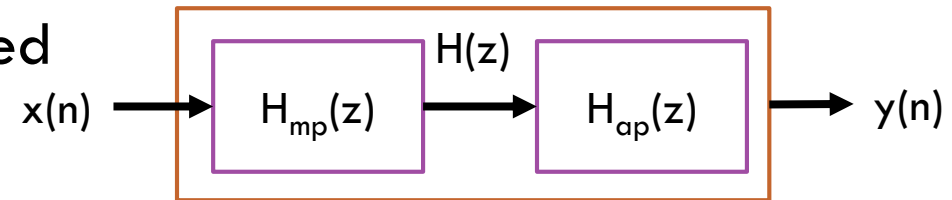
$$H(z) = \frac{\prod_k (1 - z_k z^{-1})}{\prod_i (1 - p_i z^{-1})}$$

Minimum phase/allpass decomposition

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MMSP 1 - 07 Digital Filters

- A causal **stable** filter $H(z)$ can always be decomposed into its minimum phase $H_{mp}(z)$ and allpass $H_{ap}(z)$ components



- Assumption: $H(z)$ is **stable** \rightarrow poles p are all in the unit circle
- Split the zeros z into
 - ▣ minimum phase $|z_{min}| < 1$
 - ▣ maximum phase $|z_{max}| > 1$

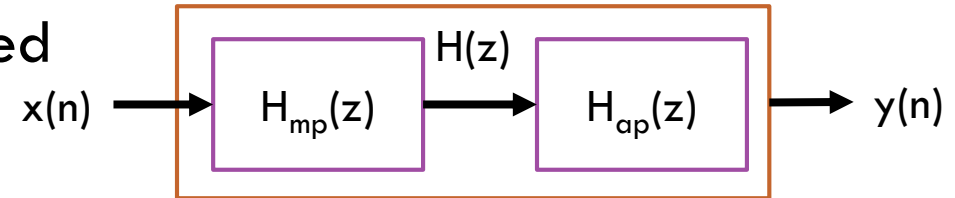
$$H(z) = \frac{\prod_{u \in z_{min}} (1 - z_u z^{-1}) \prod_{v \in z_{max}} (1 - z_v z^{-1})}{\prod_i (1 - p_i z^{-1})}$$

Minimum phase/allpass decomposition

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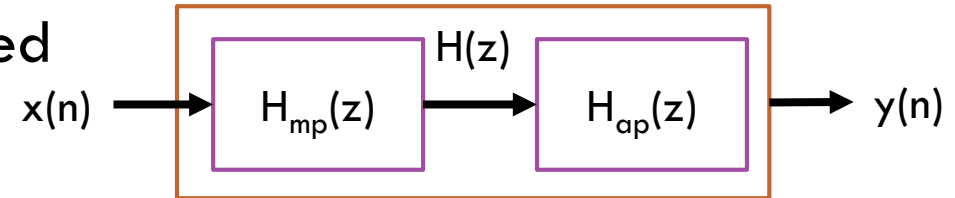
- A causal **stable** filter $H(z)$ can always be decomposed into its minimum phase $H_{mp}(z)$ and allpass $H_{ap}(z)$ components



- Assumption: $H(z)$ is **stable** \rightarrow poles p are all in the unit circle
 - Split the zeros z into
 - ▣ minimum phase $|z_{min}| < 1$
 - ▣ maximum phase $|z_{max}| > 1$
- $$H(z) = \frac{\prod_{u \in z_{min}} (1 - z_u z^{-1}) \prod_{v \in z_{max}} (1 - z_v z^{-1})}{\prod_i (1 - p_i z^{-1})}$$
- $H_{ap}(z)$ is composed of $z_{ap} = z_{max}$ and $p_{ap} = 1/z_{max}^*$
 - ▣ H_{ap} is still stable, but we need to compensate for the extra poles p_{ap}

Minimum phase/allpass decomposition

- A causal **stable** filter $H(z)$ can always be decomposed into its minimum phase $H_{mp}(z)$ and allpass $H_{ap}(z)$ components



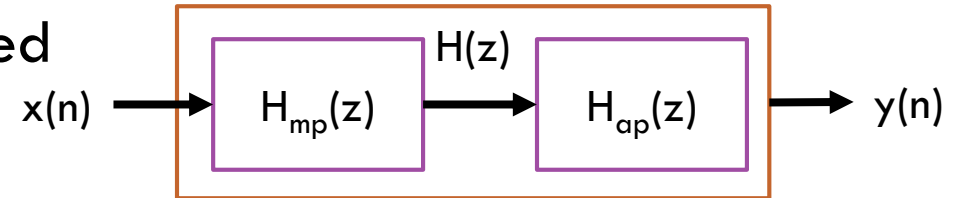
- Assumption: $H(z)$ is **stable** \rightarrow poles p are all in the unit circle
- Split the zeros z into

$$H(z) = \frac{\prod_{u \in z_{min}} (1 - z_u z^{-1})}{\prod_i (1 - p_i z^{-1})} \frac{\prod_{v \in z_{max}} (1 - z_v z^{-1})}{\prod_{v \in z_{max}} (1 - \frac{1}{z_v^*} z^{-1})} \prod_{v \in z_{max}} (1 - \frac{1}{z_v^*} z^{-1})$$

- $H_{ap}(z)$ is composed of $z_{ap} = z_{max}$ and $p_{ap} = 1/z_{max}^*$
 - ▣ H_{ap} is still stable, but we need to compensate for the extra poles p_{ap}

Minimum phase/allpass decomposition

- A causal **stable** filter $H(z)$ can always be decomposed into its minimum phase $H_{mp}(z)$ and allpass $H_{ap}(z)$ components



- Assumption: $H(z)$ is **stable** \rightarrow poles p are all in the unit circle
- Split the zeros z into

$$H(z) = \frac{\prod_{u \in z_{min}} (1 - z_u z^{-1}) \prod_{v \in z_{max}} (1 - \frac{1}{z_v^*} z^{-1})}{\prod_i (1 - p_i z^{-1})} H_{ap}(z)$$

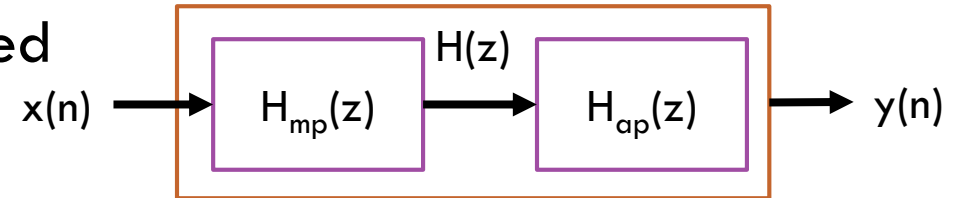
- H_{mp} filter is composed of $z_{mp} = [z_{min}, 1/z_{max}^*]$; $p_{mp} = p$
 - ▣ H_{mp} is stable AND invertible

Minimum phase/allpass decomposition

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- A causal **stable** filter $H(z)$ can always be decomposed into its minimum phase $H_{mp}(z)$ and allpass $H_{ap}(z)$ components



$$H(z) = H_{mp}(z)H_{ap}(z)$$

$$|H^{-1}(z)| = |H_{mp}^{-1}(z)| \cdot |H_{ap}(z)|$$

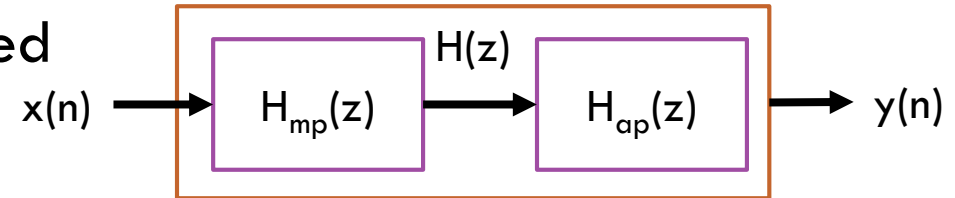
$$H_{mp}(z) = \frac{\prod_{u \in z_{min}} (1 - z_u z^{-1}) \prod_{v \in p_{max}} (1 - p_v z^{-1})}{\prod_i (1 - p_i z^{-1})}$$
$$H_{ap}(z) = \frac{\prod_{v \in z_{max}} (1 - z_v z^{-1})}{\prod_{v \in p_{max}} (1 - p_v z^{-1})}$$
$$p_{max} \stackrel{\text{def}}{=} 1/z_{max}^*$$

Minimum phase/allpass decomposition

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MMSP 1 - 07 Digital Filters

- A causal **stable** filter $H(z)$ can always be decomposed into its minimum phase $H_{mp}(z)$ and allpass $H_{ap}(z)$ components



$$H(z) = H_{mp}(z)H_{ap}(z)$$

$$|H^{-1}(z)| = |H_{mp}^{-1}(z)| \cdot |H_{ap}(z)|$$

$$H_{mp}(z) = \frac{\prod_{u \in z_{min}} (1 - z_u z^{-1}) \prod_{v \in p_{max}} (1 - p_v z^{-1})}{\prod_i (1 - p_i z^{-1})}$$

$p_{max} \stackrel{\text{def}}{=} 1/z_{max}^*$

$$H_{ap}(z) = \frac{\prod_{v \in z_{max}} (1 - z_v z^{-1})}{\prod_{v \in p_{max}} (1 - p_v z^{-1})}$$

Test with

$$p = \{0.9; 0.8e^{\pm i\frac{\pi}{2}}\}$$

$$z = \{2; 3e^{\pm i\frac{\pi}{8}}; 0.5e^{\pm i\frac{\pi}{4}}\}$$

Minimum phase/allpass decomposition

```
z=[2; 3*exp(1i*pi/8); 3*exp(-1i*pi/8);  
    0.5*exp(1i*pi/4); 0.5*exp(-1i*pi/4)];  
p=[0.9; 0.8*exp(1i*pi/2); 0.8*exp(1i*pi/2)];  
b=poly(z); a=poly(p); [H,f]=freqz(b,a);  
z_min=z(abs(z)<1); z_max=z(abs(z)>=1);  
p_max=1./conj(z_max); b_ap=poly(z_max);  
a_ap=poly(p_max); H_ap=freqz(b_ap,a_ap);  
z_mp=[z_min; p_max]; b_mp=poly(z_mp); a_mp=a;  
H_mp=freqz(b_mp,a);  
H_=H_mp.*H_ap;
```

Minimum phase/allpass decomposition

