Discrete-Time IIR Filter Design from Continuous-Time Filters

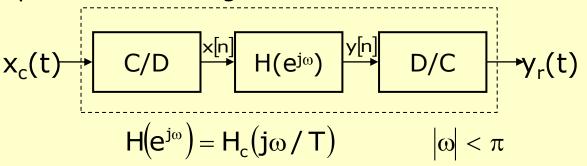
Quote of the Day

Experience is the name everyone gives to their mistakes.

Oscar Wilde

Filter Design Techniques

- Any discrete-time system that modifies certain frequencies
- Frequency-selective filters pass only certain frequencies
- Filter Design Steps
 - Specification
 - Problem or application specific
 - Approximation of specification with a discrete-time system
 - Our focus is to go from spec to discrete-time system
 - Implementation
 - Realization of discrete-time systems depends on target technology
- We already studied the use of discrete-time systems to implement a continuous-time system
 - If our specifications are given in continuous time we can use

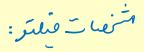


Filter Specifications

 $|H_{\rm eff}(j\Omega)|$

 $1 + \delta_1$

 $1 - \delta_1$



Specifications

- Passband

$$0.99 \le \left| H_{eff} \left(j\Omega \right) \right| \le 1.01 \quad 0 \le \Omega \le 2\pi \left(2000 \right)$$

Stopband

$$\left|H_{eff}\!\!\left(j\Omega\right)\right| \leq 0.001 \quad 2\pi\!\!\left(3000\right) \leq \Omega$$

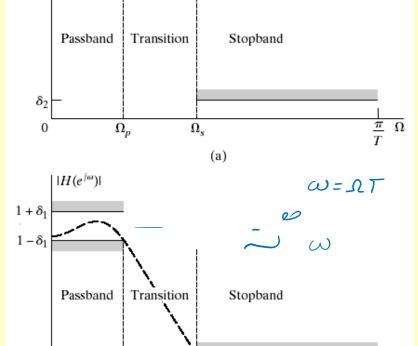
Parameters

$$\delta_1=0.01$$

Check $\delta_2=0.001$

Let $\Omega_p=2\pi(2000)$
 $\Omega_s=2\pi(3000)$





Specs in dB

- Ideal passband gain = 20log(1) = 0 dB
- Max passband gain = $20\log(1.01) = 0.086dB$
- Max stopband gain = $20\log(0.001) = -60 \text{ dB}$

عاسم وجود: هواره م الحاك (H(Z) كرى ،على، بايداد و تعنق رايافت كه در pec داده شه عسف كند. ، کی جعفر زرد تو ندو می سی کند صفر می لاده آل نزدی م نفع ری ر مقبعی رته فیلتر ۵ کاردد. Til pre de l'il FIR: Viou). j'é non) عراحی رای مرای ایک ارمی رفتر رای کی ایک ایک ایک رفتر ایل کاری طرای ایک ایک رفتی و در باره طرای ایک ایک ایک و : رسرسم های را ته فاز را در تعام کرند را دید در در آنه کار نوات . ا ٣- برئة منتز رازي ركيا. هدف: رسورهم صواحی فیلس titler fdatool: MATLAB: 5'c. she = 6'9

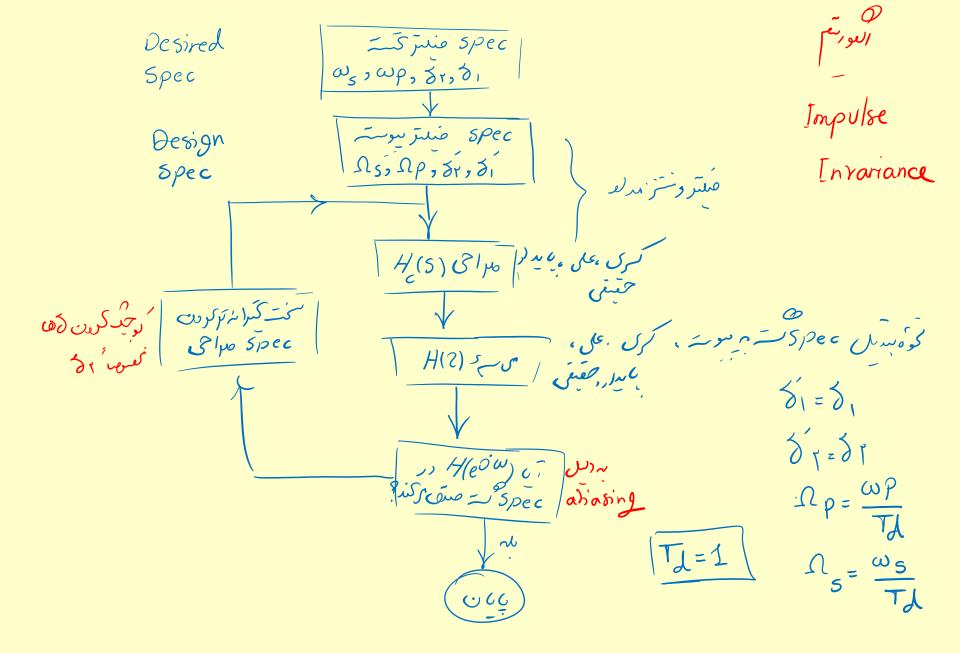
Arslan design 351M Digital Signal Processing

analysis

: خارای زبان سے فارمای ۱۳۲ از فارمای سوست: ۲.2 Impulse Invariance,

Bilinear Transformation, Windowing ,1 > FIR
Optimum Approximation, 1 · MATLAB, W COLLON تربع البورسم ملهای فینس: علی بایدلاد ، علی بایدلاد ، علی تربیطی فینسو: تربیطی فینسو: ملهای فینسو: تربیطی فینسود و توقیق می ایدان این این مله ای این میناد این این میناد این این میناد این

h[n] = Tih(nTi)



$$H_{c}(S) \rightarrow h(G) \rightarrow h(R) \rightarrow H(R) \rightarrow H(R) \rightarrow H(R)$$

$$H_{c}(S) = \underbrace{\frac{Ak}{s-s}}_{K} \xrightarrow{S-s}_{K}$$

$$h_{c}(G) = \underbrace{\frac{Ak}{s-s}}$$

Impulse Invariance - & ١- عم كسرل معرها آ ملقرررالبورسم المعالم علقررالبورسم ٣ - إلى در كـــ كرار كرفع ك ها مركز بر افزا - در ك كرار كرفع ك ها مركز بر افزا - در ك كرار كرفعه ك زر الزهر کرده در احت ارتصار کرده کارم دھال کسرتی

Butterworth Lowpass Filters

- Passband is designed to be maximally flat
- The magnitude-squared function is of the form

$$|H_{c}(j\Omega)|^{2} = \frac{1}{1 + (j\Omega/j\Omega_{c})^{2N}}$$

$$|H_{c}(s)|^{2} = \frac{1}{1 + (s/j\Omega_{c})^{2N}}$$

$$N = 2$$

$$N = 4$$

$$N = 8$$

$$\Omega_{c}$$

$$s_k = (-1)^{1/2N} (j\Omega_c) = \Omega_c e^{(j\pi/2N)(2k+N-1)}$$
 for $k = 0,1,...,2N-1$

Chebyshev Filters

- Equiripple in the passband and monotonic in the stopband
- Or equiripple in the stopband and monotonic in the passband

$$|H_c(j\Omega)|^2 = \frac{1}{1 + \varepsilon^2 V_N^2(\Omega/\Omega_c)} \qquad V_N(x) = \cos(N\cos^{-1}x)$$

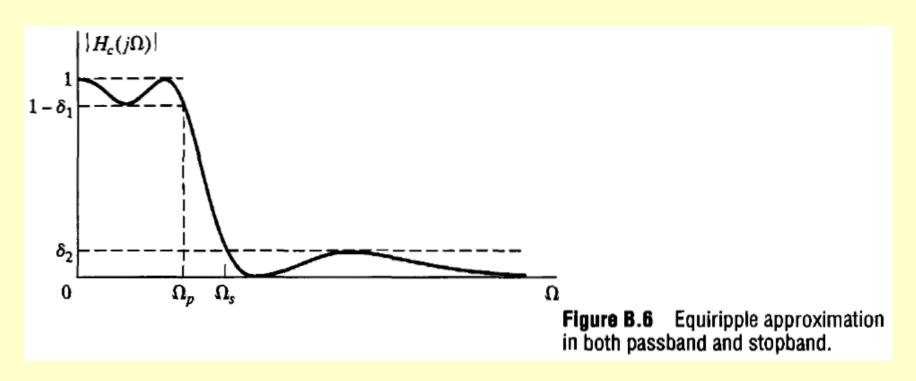
$$|H_c(j\Omega)|$$
Equipple
$$1 - \epsilon$$

$$1 - \epsilon$$

$$\Omega_c$$

Elliptic Filters





Filter Design by Impulse Invariance

- Remember impulse invariance
 - Mapping a continuous-time impulse response to discrete-time
 - Mapping a continuous-time frequency response to discrete-time

$$h[n] = T_d h_c (nT_d)$$

$$H(e^{j\omega}) = \sum_{k=-\infty}^{\infty} H_c \left(j \frac{\omega}{T_d} + j \frac{2\pi}{T_d} k \right)$$

If the continuous-time filter is bandlimited to

$$H_c(j\Omega) = 0$$
 $|\Omega| \ge \pi / T_d$

$$H(e^{j\omega}) = H_c(j\frac{\omega}{T_d}) \quad |\omega| \leq \pi$$

- If we start from discrete-time specifications T_d cancels out
 - Start with discrete-time spec in terms of $\boldsymbol{\omega}$
 - Go to continuous-time $\Omega = \omega$ /T and design continuous-time filter
 - Use impulse invariance to map it back to discrete-time $\omega = \Omega T$
- Works best for bandlimited filters due to possible aliasing

Impulse Invariance of System Functions

- Develop impulse invariance relation between system functions
- Partial fraction expansion of transfer function

$$H_c(s) = \sum_{k=1}^{N} \frac{A_k}{s - s_k}$$

Corresponding impulse response

$$h_c(t) = \begin{cases} \sum_{k=1}^{N} A_k e^{s_k t} & t \ge 0 \\ 0 & t < 0 \end{cases}$$

Impulse response of discrete-time filter

$$h[n] = T_d h_c \big(n T_d \big) = \sum_{k=1}^N T_d A_k e^{s_k n T_d} u[n] = \sum_{k=1}^N T_d A_k \big(e^{s_k T_d} \big)^n u[n]$$

System function

$$H(z) = \sum_{k=1}^{N} \frac{T_d A_k}{1 - e^{s_k T_d} z^{-1}}$$

Pole s=s_k in s-domain transform into pole at e^{s_kT_d}



Example



Impulse invariance applied to Butterworth

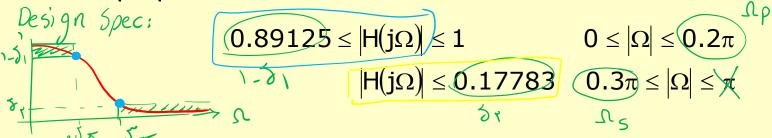
$$|H(e^{j\omega})| \leq 0.17783$$

$$|O| \leq |\omega| \leq 0.2\pi$$

$$|H(e^{j\omega})| \leq 0.17783$$

$$|O| \leq |\omega| \leq \pi$$

- Since sampling rate T_d cancels out we can assume $T_d=1$
- Map spec to continuous time



Butterworth filter is monotonic so spec will be satisfied if

$$H_c(j0.2\pi) \stackrel{>}{\geq} 0.89125$$
 and $H_c(j0.3\pi) \stackrel{>}{\leq} 0.17783$ $H_c(j\Omega)^2 = \frac{1}{1 + (j\Omega/j\Omega_c)^{2N}}$

• Determine N and Ω_c to satisfy these conditions

Example Cont'd

Satisfy both constrains

$$1 + \left(\frac{0.2\pi}{\Omega_c}\right)^{2N} = \left(\frac{1}{0.89125}\right)^2 \qquad \text{and} \qquad 1 + \left(\frac{0.3\pi}{\Omega_c}\right)^{2N} = \left(\frac{1}{0.17783}\right)^2$$

Solve these equations to get

$$\Rightarrow$$
 N = 5.8858 \cong 6 and \Rightarrow $\Omega_c = 0.70474$ \Rightarrow $H_c(s)H_c(-s)$

- N must be an integer so we round it up to meet the spec $\stackrel{\mathcal{H}_{c}(S)}{\times}$
- Poles of transfer function

$$s_k = (-1)^{1/12}(j\Omega_c) = \Omega_c e^{(j\pi/12)(2k+11)}$$
 for $k = 0,1,...,11$

$$s_{k} = (-1)^{1/12}(j\Omega_{c}) = \Omega_{c}e^{(j\pi/12)(2k+11)} \quad \text{for } k = 0,1,...,11$$
• The transfer function
$$H(s) = \frac{0.12093}{(s^{2} + 0.364s + 0.4945)(s^{2} + 0.9945s + 0.4945)(s^{2} + 1.3585s + 0.4945)}$$

5K -> e5k Mapping to z-domain

$$H(z) = \frac{0.2871 - 0.4466z^{-1}}{1 - 1.2971z^{-1} + 0.6949z^{-2}} + \frac{-2.1428 + 1.1455z^{-1}}{1 - 1.0691z^{-1} + 0.3699z^{-2}}$$

محل صفر و قطبها

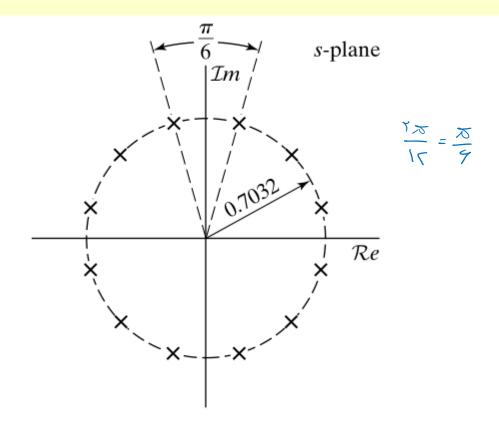


Figure 4 s-plane locations for poles of $H_{\underline{C}}(s)H_{\underline{C}}(-s)$ for 6th-order Butterworth filter in Example 2.

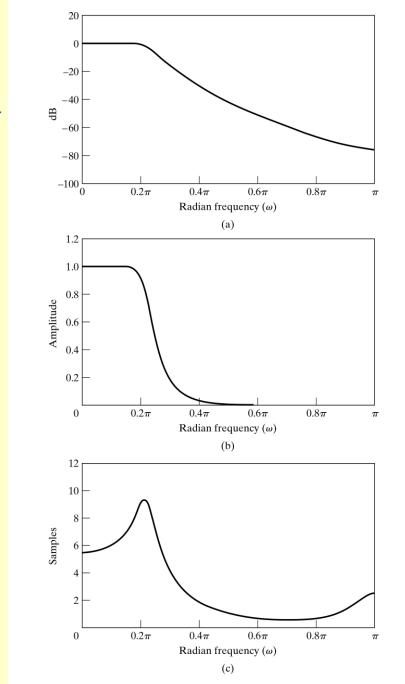
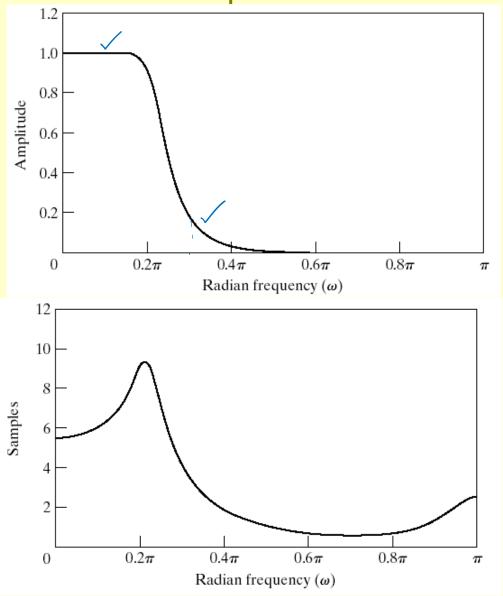


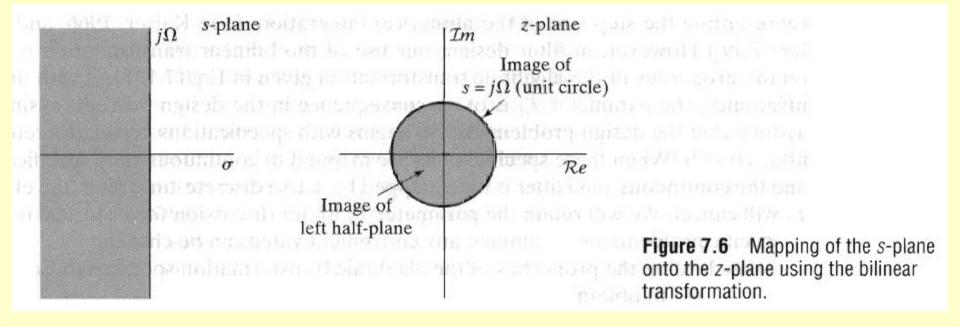
Figure 5 Frequency response of 6th-order Butterworth filter transformed by impulse invariance. (a) Log magnitude in dB. (b) Magnitude. (c) Group delay.

Example Cont'd



Bilinear Transformation الگوريتم

$$S = \frac{1}{1} \left(\frac{1-2}{1+2} \right)$$



Filter Design by Bilinear Transformation

- Get around the aliasing problem of impulse invariance
- Map the entire s-plane onto the unit-circle in the z-plane
 - Nonlinear transformation
 - Frequency response subject to warping
- Bilinear transformation

 $S = \frac{2}{T_d} \left(\frac{1 - z^{-1}}{1 + z^{-1}} \right)$

Transformed system function

Transformed system function
$$H(\mathcal{I}) = H_c(s) / H(z) = H_c\left[\frac{2}{T_d}\left(\frac{1-z^{-1}}{1+z^{-1}}\right)\right]$$
Again T_d cancels out so we can ignore it

- Again T_d cancels out so we can ignore it
- We can solve the transformation for z as

$$z = \frac{1 + (T_d/2)s}{1 - (T_d/2)s} = \frac{1 + \sigma T_d/2 + j\Omega T_d/2}{1 - \sigma T_d/2 - j\Omega T_d/2}$$
 $s = \sigma + j\Omega$

- Maps the left-half s-plane into the inside of the unit-circle in z
 - Stable in one domain would stay in the other

 $\delta_1, \delta_7, \omega_p, \omega_s$ مرك عند المعور الماور م الماد. المرك عند المعور المعور م الماد. Design Solis abasing - 8 · cis = , ~ o> - 4(2) - 0 $H(Z) = H_c(S)$

Bilinear Transformation

On the unit circle the transform becomes

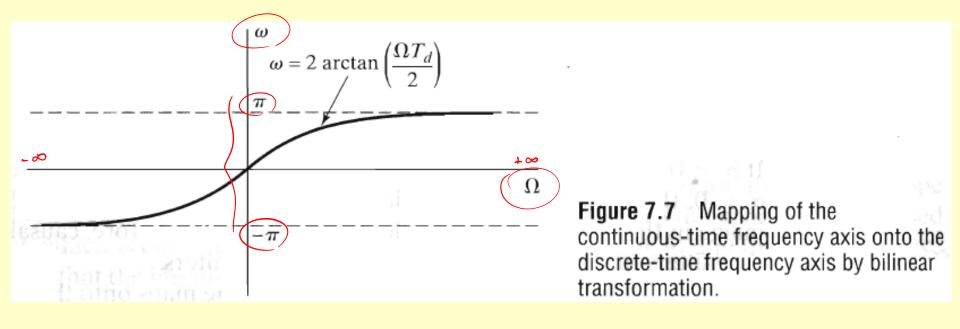
$$z = \frac{1 + j\Omega T_d / 2}{1 - j\Omega T_d / 2} = e^{j\omega}$$

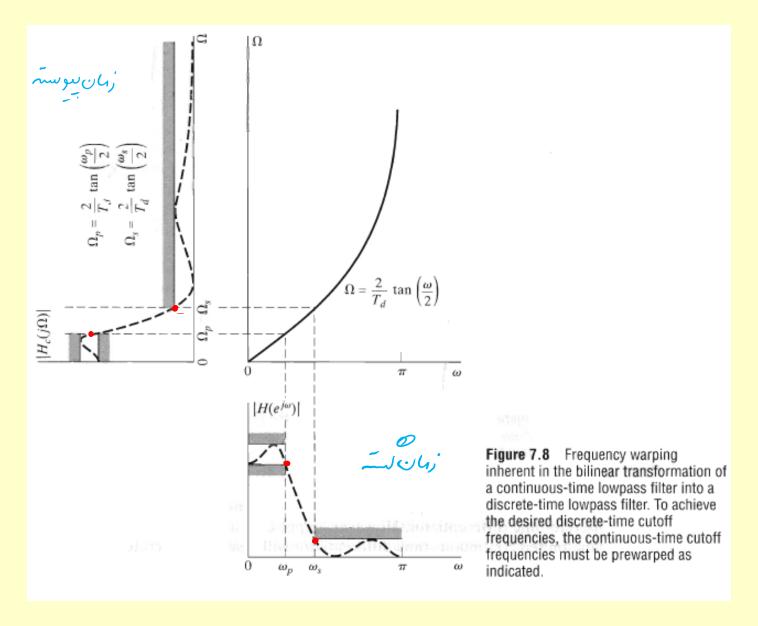
• To derive the relation between ω and Ω

$$s = \frac{2}{T_{d}} \left(\frac{1 - e^{-j\omega}}{1 + e^{-j\omega}} \right) = \sigma + j\Omega = \frac{2}{T_{d}} \left[\frac{2e^{-j\omega/2} j sin(\omega/2)}{2e^{-j\omega/2} cos(\omega/2)} \right] = \frac{2j}{T_{d}} tan\left(\frac{\omega}{2} \right)$$

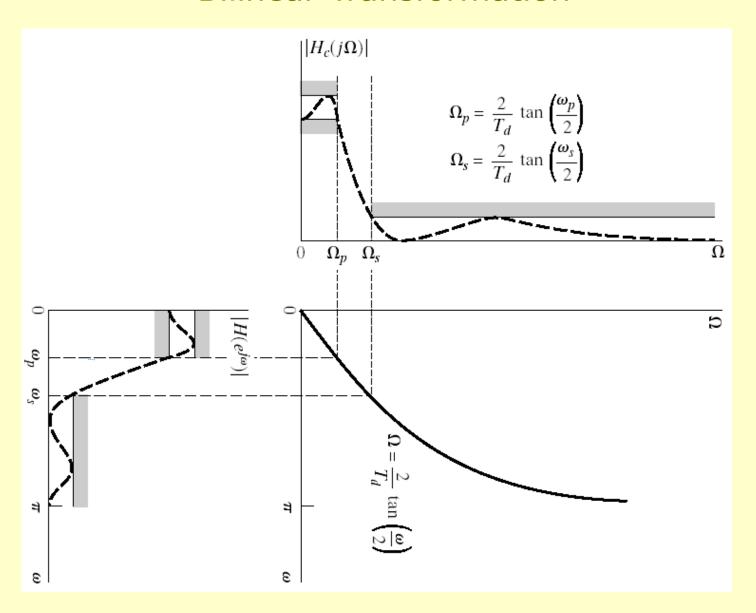
Which yields

$$\Omega = \frac{2}{T_d} tan \left(\frac{\omega}{2} \right)$$
 or $\omega = 2 arctan \left(\frac{\Omega T_d}{2} \right)$

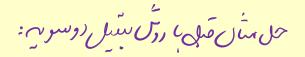




Bilinear Transformation



Example



Bilinear transform applied to Butterworth

$$0.89125 \le \left| H(e^{j\omega}) \right| \le 1$$

$$0 \le |\omega| \le 0.2\pi$$

$$|H(e^{j\omega})| \le 0.17783$$
 $0.3\pi \le |\omega| \le \pi$

$$0.3\pi \leq |\omega| \leq \pi$$

Apply bilinear transformation to specifications

$$0.89125 \le \left| H(j\Omega) \right| \le 1$$

$$\left| H(j\Omega) \right| \leq 1 \qquad 0 \leq \left| \Omega \right| \leq \frac{2}{T_d} \tan \left(\frac{0.2\pi}{2} \right) \qquad \text{Spee}$$

$$\left| H(j\Omega) \right| \leq 0.17783 \qquad \frac{2}{T_d} \tan \left(\frac{0.3\pi}{2} \right) \leq \left| \Omega \right| < \infty$$

We can assume $T_d=1$ and apply the specifications to

$$\frac{1}{1 + (\Omega / \Omega_c)^{2N}} = \frac{1}{1 + (\Omega / \Omega_c)^{2N}}$$

To get

$$1 + \left(\frac{2 \, tan \, 0.1 \pi}{\Omega_c}\right)^{2N} = \left(\frac{1}{0.89125}\right)^2 \quad \text{and} \quad 1 + \left(\frac{2 \, tan \, 0.15 \pi}{\Omega_c}\right)^{2N} = \left(\frac{1}{0.17783}\right)^2 = \left(\frac{1}{0.17833}\right)^2 = \left(\frac{1}{0.178333}\right)^2 = \left(\frac{1}{0.178333}\right)^2 = \left(\frac{1}{0.178333}\right)$$

Example Cont'd

• Solve N and Ω_c

$$N = \frac{\log \left[\left(\frac{1}{0.17783} \right)^2 - 1 \right] / \left(\left(\frac{1}{0.89125} \right)^2 - 1 \right)}{2 \log \left[\tan(0.15\pi) / \tan(0.1\pi) \right]} = 5.305 \stackrel{\sim}{=} 6 \rightarrow \Omega_c = 0.766$$

The resulting transfer function has the following poles

$$s_k = (-1)^{1/12}(j\Omega_c) = \Omega_c e^{(j\pi/12)(2k+11)}$$
 for $k = 0, 1, ..., 11$

Resulting in

$$H_c(s) = \frac{0.20238}{\left(s^2 + 0.3996s + 0.5871\right)\left(s^2 + 1.0836s + 0.5871\right)\left(s^2 + 1.4802s + 0.5871\right)}$$

Applying the bilinear transform yields

pplying the bilinear transform yields
$$S = \frac{1}{\sqrt{1 - 2}} \left(\frac{1 - 2}{1 + 2} \right)$$

$$H(z) = \frac{0.0007378(1 + z^{-1})^6}{(1 - 1.2686z^{-1} + 0.7051z^{-2})(1 - 1.0106z^{-1} + 0.3583z^{-2})}$$

$$\times \frac{1}{\left(1 - 0.9044z^{-1} + 0.2155z^{-2}\right)}$$

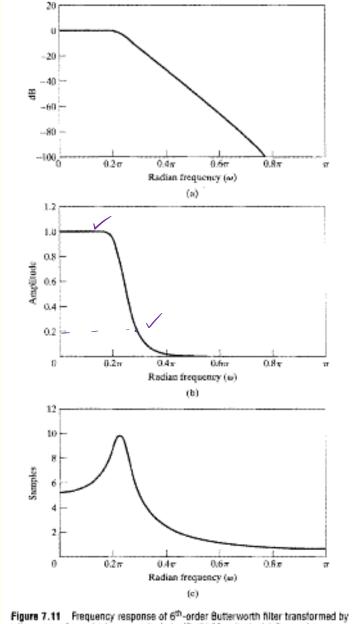
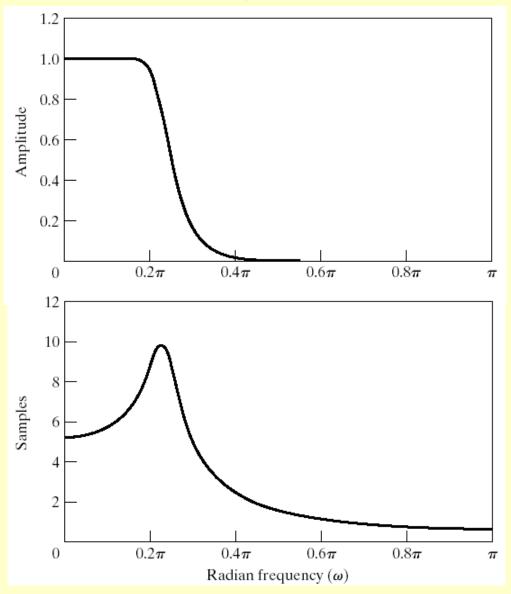


Figure 7.11 Frequency response of 6^{th} -order Butterworth filter transformed by bilinear transform. (a) Log magnitude in dB. (b) Magnitude. (c) Group delay.

Example Cont'd



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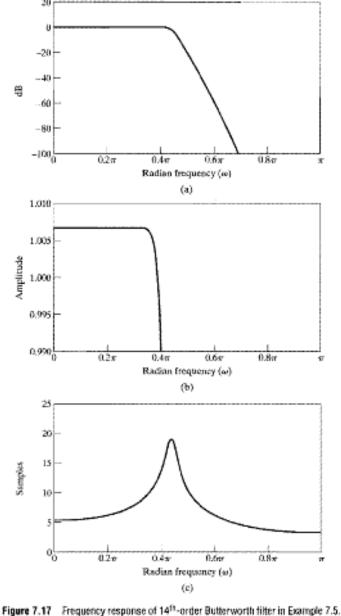


Figure 7.17 Frequency response of 14th-order Butterworth filter in Example 7.5.
(a) Log magnitude in dB. (b) Detailed plot of magnitude in passband. (c) Group delay.

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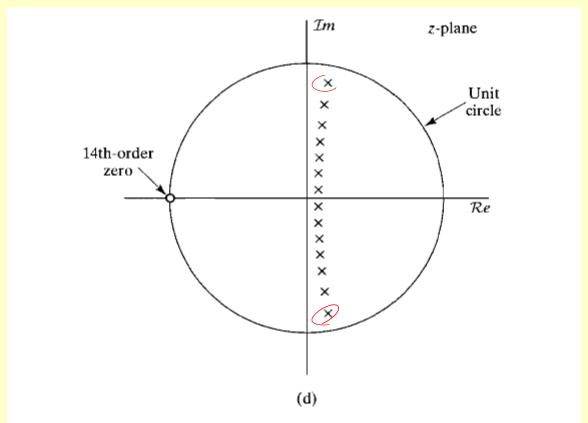
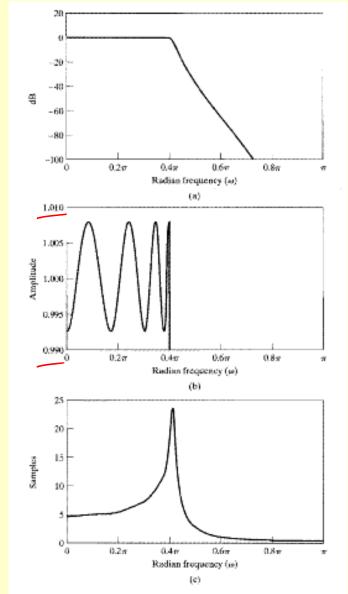


Figure 7.17 (continued) (d) Pole-zero plot of 14th-order Butterworth filter in Example 7.5.

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Figure 7.18 Frequency response of 8th-order Chebyshev type I filter in Example 7.5. (a) Log magnitude in dB. (b) Detailed plot of magnitude in passband. (c) Group detay.

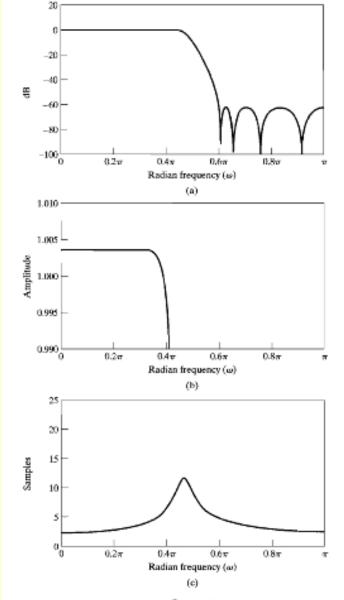


Figure 7.19 Frequency response of 8th-order Chebyshev type II filter in Example 7.5. (a) Log magnitude in dB. (b) Detailed plot of magnitude in passband. (c) Group delay.

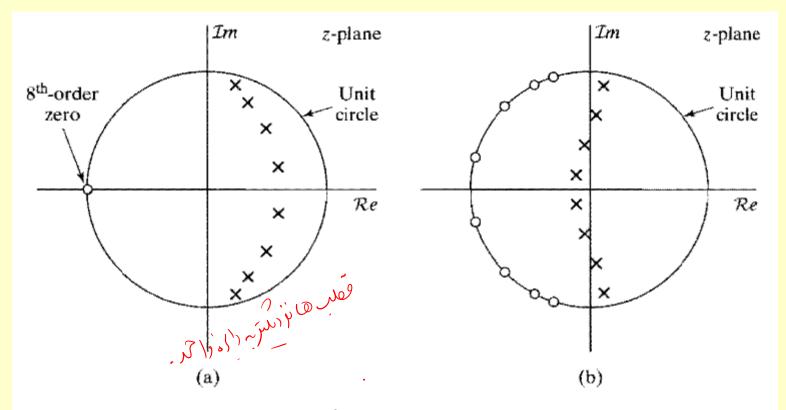


Figure 7.20 Pole-zero plot of 8th-order Chebyshev filters in Example 7.5. (a) Type I. (b) Type II.

Elliptic 6 mg

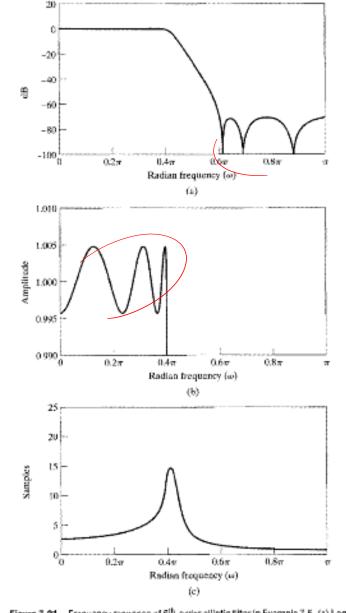


Figure 7.21 Frequency response of 6^{th} -order elliptic filter in Example 7.5. (a) Log magnitude in dB. (b) Detailed plot of magnitude in passband. (c) Group delay.

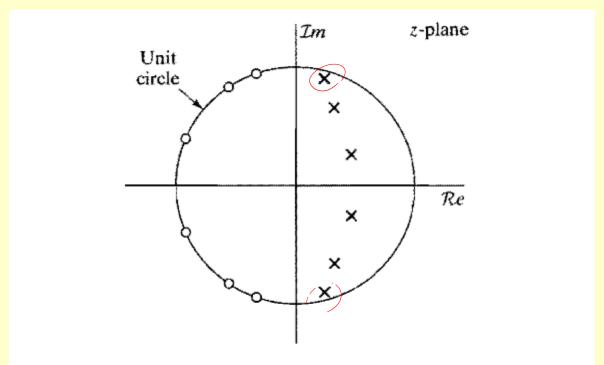
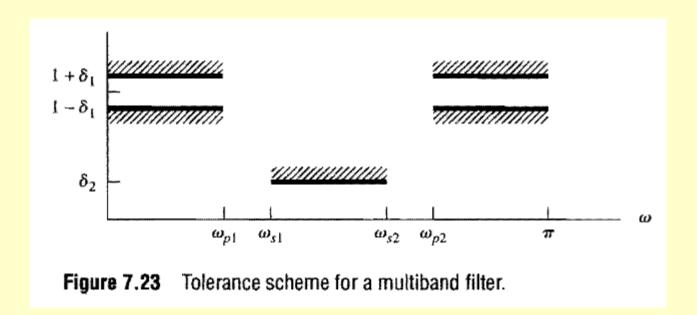


Figure 7.22 Pole-zero plot of 6th-order elliptic filter in Example 7.5.

Multiband

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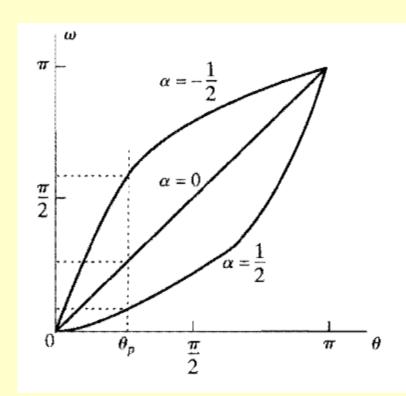


Figure 7.24 Warping of the frequency scale in lowpass-to-lowpass transformation.

TABLE 7.1 TRANSFORMATIONS FROM A LOWPASS DIGITAL FILTER PROTOTYPE OF CUTOFF FREQUENCY θ_{p} TO HIGHPASS, BANDPASS, AND BANDSTOP FILTERS

	Filter Type	Transformations	Associated Design Formulas	
	Lowpass	$Z^{-1} = \frac{z^{-1} - \alpha}{1 - az^{-1}}$	$\alpha = \frac{\sin\left(\frac{\theta_p - \omega_p}{2}\right)}{\sin\left(\frac{\theta_p + \omega_p}{2}\right)}$ $\omega_p = \text{desired cutoff frequency}$	
✓	Highpass	$ \overline{Z^{-1}} = -\frac{\overline{z^{-1}} + \alpha}{1 + \alpha z^{-1}} $ $ \alpha \overline{z^{-1}} = -\frac{\alpha}{1 + \alpha z^{-1}} $ $ \alpha \overline{z^{-1}} = -\frac{\alpha}{1 + \alpha z^{-1}} $	$\alpha = -\frac{\cos\left(\frac{\theta_p + \omega_p}{2}\right)}{\cos\left(\frac{\theta_p - \omega_p}{2}\right)} \qquad \mathcal{HP}$ $\omega_p = \text{desired cutoff frequency} \qquad \mathcal{HP}$	z) = H _{lp} (2) =
✓	Bandpass	, and the second	$\alpha = \frac{\cos\left(\frac{\omega_{p2} + \omega_{p1}}{2}\right)}{\cos\left(\frac{\omega_{p2} - \omega_{p1}}{2}\right)}$ $k = \cot\left(\frac{\omega_{p2} - \omega_{p1}}{2}\right) \tan\left(\frac{\theta_p}{2}\right)$ $\omega_{p1} = \text{desired lower cutoff frequency}$ $\omega_{p2} = \text{desired upper cutoff frequency}$	
✓	Bandstop	$Z^{-1} = \frac{z^{-2} - \frac{2\alpha}{1+k}z^{-1} + \frac{1-k}{1+k}}{\frac{1-k}{1+k}z^{-2} - \frac{2\alpha}{1+k}z^{-1} + 1}$	$\alpha = \frac{\cos\left(\frac{\omega_{p2} + \omega_{p1}}{2}\right)}{\cos\left(\frac{\omega_{p2} - \omega_{p1}}{2}\right)}$ $k = \tan\left(\frac{\omega_{p2} - \omega_{p1}}{2}\right) \tan\left(\frac{\theta_p}{2}\right)$ $\omega_{p1} = \text{desired lower cutoff frequency}$ $\omega_{p2} = \text{desired upper cutoff frequency}$	

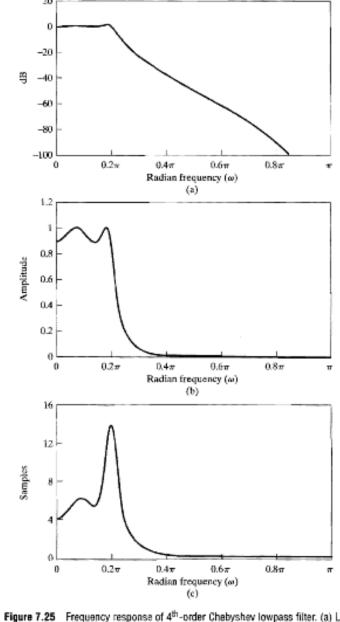


Figure 7.25 Frequency response of 4th-order Chebyshev lowpass filter. (a) Log magnitude in dB. (b) Magnitude. (c) Group delay.

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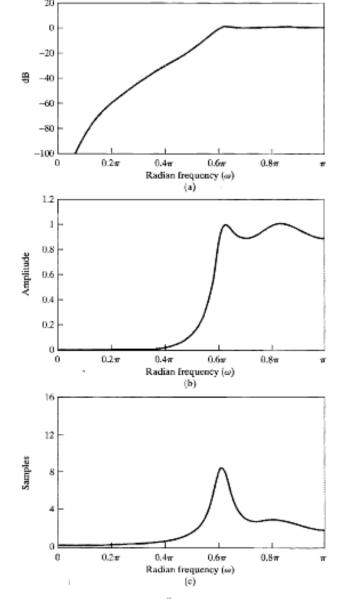


Figure 7.26 Frequency response of 4th-order Chebyshev highpass filter obtained by frequency transformation. (a) Log magnitude in dB. (b) Magnitude. (c) Group delay.

wy windowing ! FIR slopinio 8/15 - FIR slopinio 8/15 - FIR slopinio 8/15 - FIR slopinio 8/16 - FIR slopini

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Filter Design by Windowing

- Simplest way of designing FIR filters
- Method is all discrete-time no continuous-time involved
- Start with ideal frequency response

$$H_{d}\!\left(\!e^{j\omega}\right)\!=\sum_{n=-\infty}^{\infty}\!h_{d}\!\left[\!n\right]\!e^{-j\omega n} \qquad \qquad h_{d}\!\left[\!n\right]\!=\frac{1}{2\pi}\int_{-\pi}^{\pi}\!H_{d}\!\left(\!e^{j\omega}\right)\!\!e^{j\omega n}d\omega$$

- Choose ideal frequency response as desired response
- Most ideal impulse responses are of infinite length
- The easiest way to obtain a causal FIR filter from ideal is

$$h[n] = \begin{cases} h_d[n] & 0 \le n \le M \\ 0 & else \end{cases}$$

w[n]

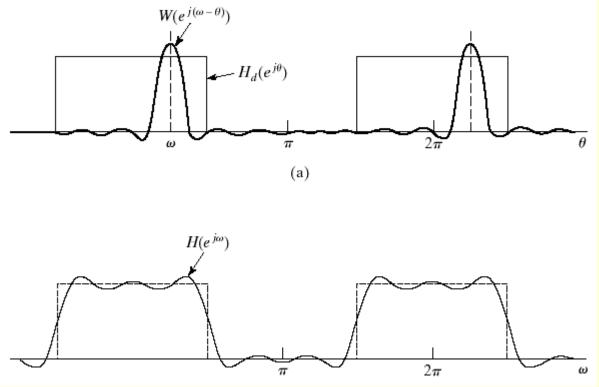
• More generally
$$h[n] = h_d[n]w[n] \quad \text{where} \quad w[n] = \begin{cases} 1 & 0 \le n \le M \\ 0 & \text{else} \end{cases}$$

Windowing in Frequency Domain

Windowed frequency response _ convolution with the chip

$$H(e^{j\omega}) = \frac{1}{2\pi} \int_{\pi}^{\pi} H_{d}(e^{j\omega}) W(e^{j(\omega-\theta)}) d\theta$$

The windowed version is smeared version of desired response



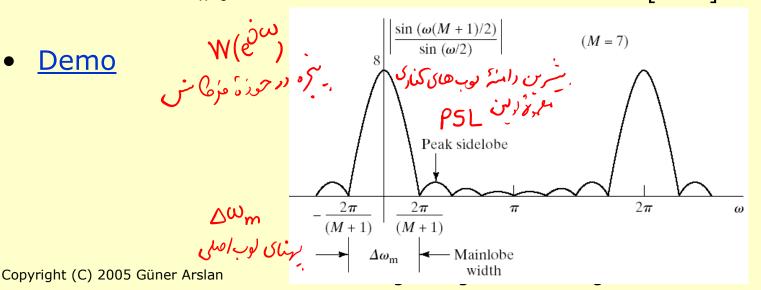
• If w[n]=1 for all n, then W($e^{j\omega}$) is pulse train with 2π period

Properties of Windows $\begin{cases} \Delta \omega_m \\ PSI \end{cases}$

- Prefer windows that concentrate around DC in frequency
 - Less smearing, closer approximation
- Prefer window that has minimal span in time
 - Less coefficient in designed filter, computationally efficient
- So we want concentration in time and in frequency
 - Contradictory requirements
- Example: Rectangular window

$$W\!\!\left(\!e^{j\omega}\right)\!=\sum_{n=0}^{M}e^{-j\omega n}\,=\!\frac{1-e^{-j\omega\left(M+1\right)}}{1-e^{-j\omega}}=e^{-j\omega M/2}\,\frac{sin\!\!\left[\omega\!\!\left(\!M+1\right)\!/2\right]}{sin\!\!\left[\omega/2\right]}$$

Demo



Rectangular Window

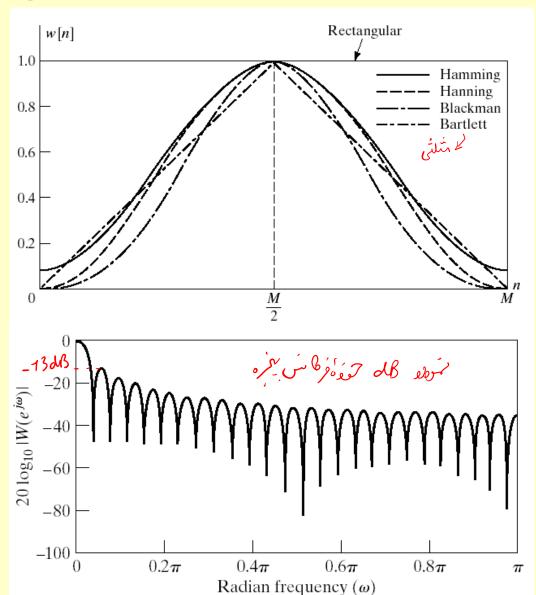
Narrowest main lob

$$\triangle^{\omega_{M}} = 4\pi/(M+1)$$

- Sharpest transitions at discontinuities in frequency
- Large side lobs

- Large oscillation around discontinuities
- Simplest window possible

$$\underline{w[n]} = \begin{cases} 1 & 0 \le n \le M \\ 0 & \text{else} \end{cases}$$



Bartlett (Triangular) Window

Medium main lob

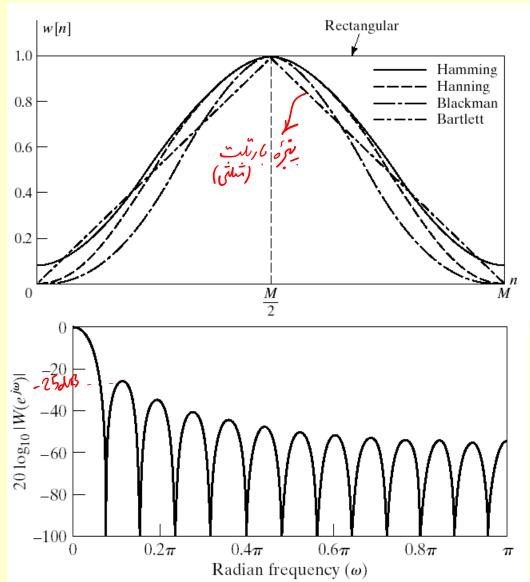
$$\triangle \omega_{\rm m} = 8\pi/{\rm M}$$
 $\triangle \omega_{\rm M}$

- Side lobs

 PSL = -25 dB
 - Hamming window performs better
 - Simple equation

$$w[n] = \begin{cases} 2n/M & 0 \le n \le M/2 \\ 2 - 2n/M & M/2 \le n \le M \end{cases}$$

$$0 & else$$



Hanning Window

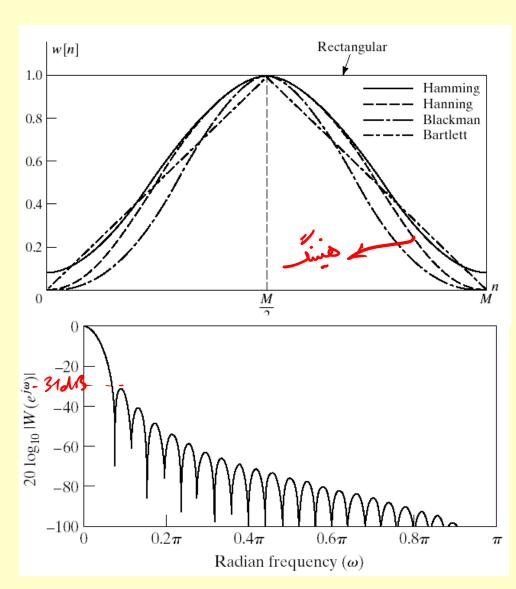


Medium main lob

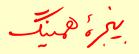
$$\Delta \omega_{m} = 8\pi/M$$
 $\Delta \omega_{m}$

- Hamming window performs better
- Same complexity as Hamming

$$w[n] = \begin{cases} \frac{1}{2} \left[1 - \cos \left(\frac{2\pi n}{M} \right) \right] & 0 \le n \le M \\ 0 & \text{else} \end{cases}$$



Hamming Window



Medium main lob

$$\triangle \omega_{\rm m} = 8\pi/M$$
 $\triangle \omega_{\rm m}$

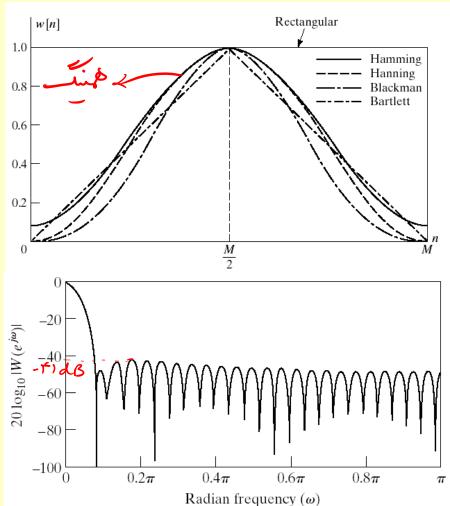
Good side lobs

Simpler than Blackman

$$w[n] = \begin{cases} 0.54 - 0.46 \cos\left(\frac{2\pi n}{M}\right) & 0 \le n \le M \end{cases}$$

$$0 \le n \le M$$

$$0$$



Blackman Window

Large main lob

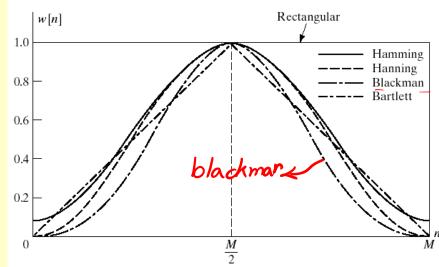
$$\Delta \omega_{M} = 12\pi/M$$

Very good side lobs

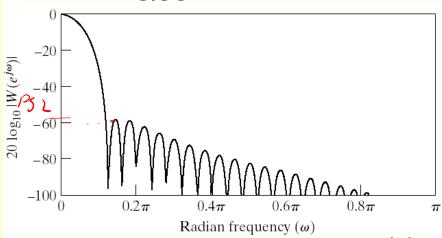
Complex equation : All ense

$$w[n] = \begin{cases} 0.42 - 0.5 \cos\left(\frac{2\pi n}{M}\right) + 0.08 \cos\left(\frac{4\pi n}{M}\right) \\ 0 \end{cases}$$

Windows Demo



$$s\left(\frac{4\pi n}{M}\right) \quad 0 \le n \le M$$
else



COMPARISON OF COMMONLY USED WINDOWS $7.693 = -7.08 \Rightarrow hann, hamming, blackman$ $AMN = 7.0 \Rightarrow AMN =$

	PS L Peak	$\nabla \omega^{W}$	Peak Approximation	نېږ د رسټ Equivalent	Transition Width
	Side-Lobe	Approximate	Error,	Kaiser	of Equivalent
Type of	Amplitude	Width of	$20\log_{10}\delta$	Window,	Kaiser
Window	(Relative)	Main Lobe	(dD)	β	Window
Rectangular	-13	$4\pi/(M+1)$	ر (db) المراس	0	$1.81\pi/M$
Bartlett	~25	$8\pi/M$	-25	1.33	$2.37\pi/M$
Hann	-31	$8\pi/M$	44	3.86	$5.01\pi/M$
Hamming	-41	$8\pi/M$	-53	4.86	$6.27\pi/M$
Blackman	(57)	$12\pi/M$	-74	7.04	$9.19\pi/M$

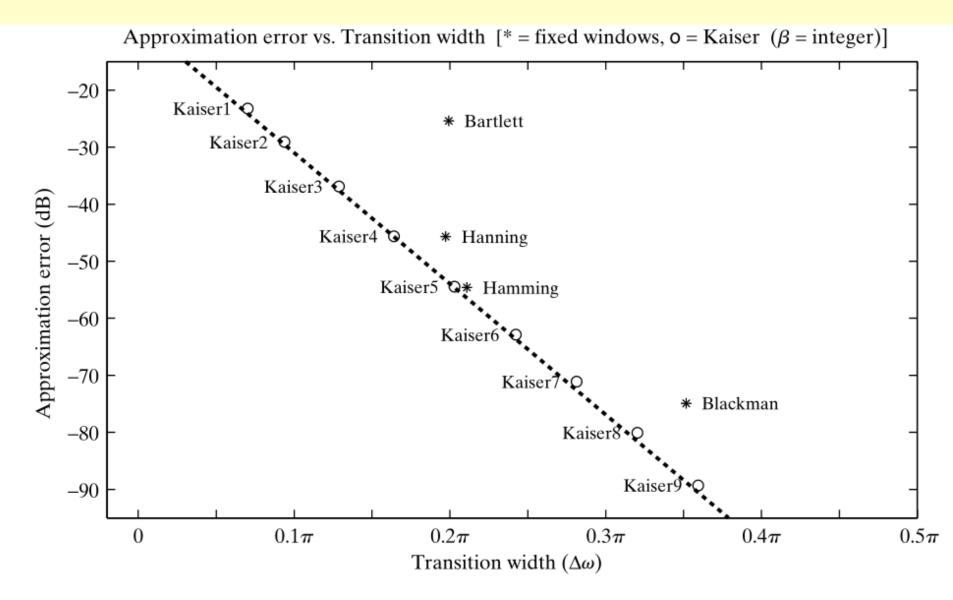


Figure 33 Comparison of fixed windows with Kaiser windows in a lowpass filter design application (M=32 and $\omega_{\mathcal{C}}=\pi/2$). (Note that the designation "Kaiser 6" means Kaiser window with $\beta=6$, etc.)

Incorporation of Generalized Linear Phase

- Windows are designed with linear phase in mind
 - Symmetric around M/2

$$w[n] = \begin{cases} w[M-n] & 0 \le n \le M \\ 0 & \text{else} \end{cases}$$

So their Fourier transform are of the form

$$W\!\!\left(\!e^{j\omega}\right)\!=W_{\!e}\!\left(\!e^{j\omega}\right)\!\!e^{-j\omega M/2}\qquad \qquad \text{where }W_{\!e}\!\left(\!e^{j\omega}\right)\!\text{is a real and even}$$

- Will keep symmetry properties of the desired impulse response
- Assume symmetric desired response

$$H_d(e^{j\omega}) = H_e(e^{j\omega})e^{-j\omega M/2}$$

With symmetric window

$$A_{e}\left(e^{j\omega}\right) = \frac{1}{2\pi} \int_{-\pi}^{\pi} H_{e}\left(e^{j\theta}\right) W\left(e^{j(\omega-\theta)}\right) d\theta$$

- Periodic convolution of real functions

Linear-Phase Lowpass filter

Desired frequency response

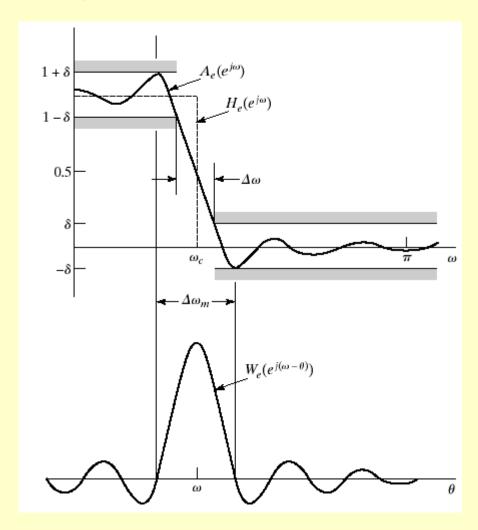
$$H_{lp}\left(e^{j\omega}\right) = \begin{cases} e^{-j\omega M/2} & \left|\omega\right| < \omega_{c} \\ 0 & \omega_{c} < \left|\omega\right| \le \pi \end{cases}$$

 Corresponding impulse response

$$h_{lp}[n] = \frac{\sin[\omega_c(n - M/2)]}{\pi(n - M/2)}$$

 Desired response is even symmetric, use symmetric window

$$\Rightarrow h[n] = \frac{\sin[\omega_c(n - M/2)]}{\pi(n - M/2)} w[n]$$



Kaiser Window Filter Design Method

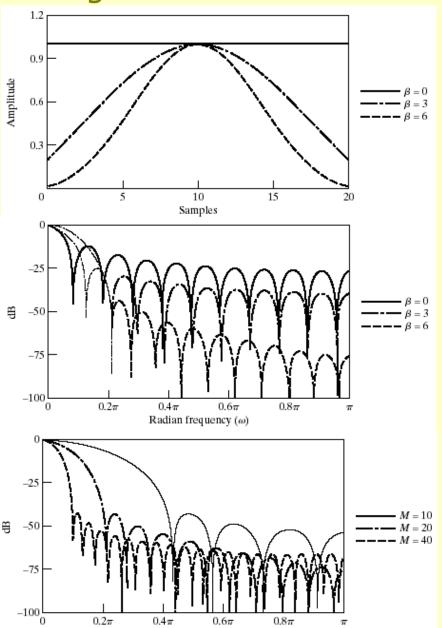
- Parameterized equation forming a set of windows
 - Parameter to change mainlob width and side-lob area trade-off

$$w[n] = \begin{cases} I_0 \left[\beta \sqrt{1 - \left(\frac{n - M/2}{M/2} \right)^2} \right] \\ I_0(\beta) \\ 0 \end{cases}$$

$$0 \le n \le M$$
 else

 I₀(.) represents zeroth-order modified Bessel function of 1st kind

del E'es à l'ever de C.L: 70



Radian frequency (ω)

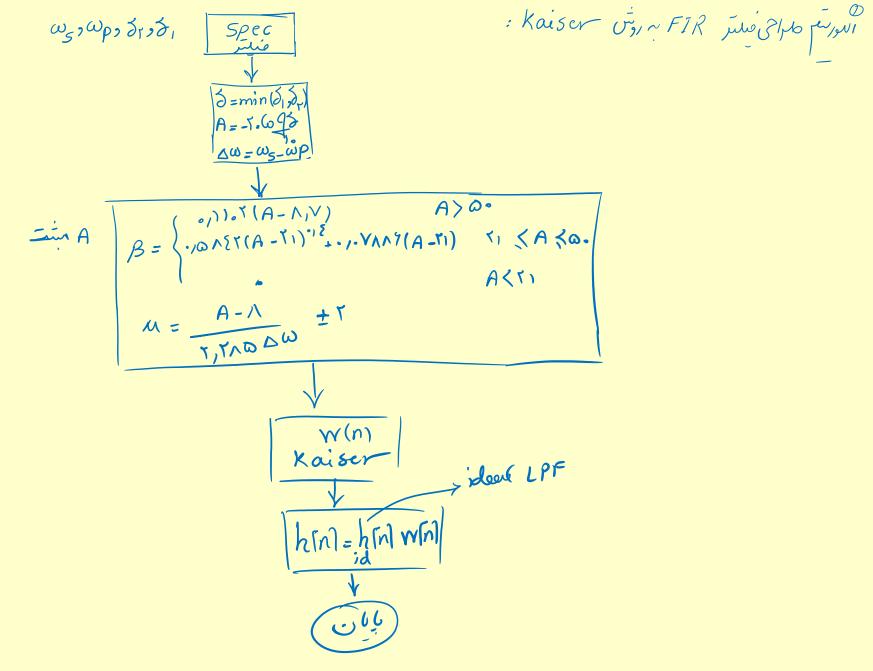
الاسترار المرهاى بيرة Kaiser الاستونيات فيستر: Determining Kaiser Window Parameters

- Given filter specifications Kaiser developed empirical equations
 - Given the peak approximation error δ or in dB as A=-20log₁₀ δ
 - and transition band width $\Delta\omega = \omega_{\rm s} \omega_{\rm p}$
- The shape parameter β should be

$$\beta = \begin{cases} 0.1102(A - 8.7) & A > 50 \\ 0.5842(A - 21)^{0.4} + 0.07886(A - 21) & 21 \le A \le 50 \\ 0 & A < 21 \end{cases}$$

The filter order M is determined approximately by

$$\Rightarrow M = \frac{A - 8}{2.285\Delta\omega}$$



Example: Kaiser Window Design of a Lowpass Filter

- Specifications $\omega_p = 0.4\pi, \omega_s = 0.6\pi, \delta_1 = 0.01, \delta_2 = 0.001$
- Window design methods assume $\delta_1 = \delta_2 = 0.001$
- Determine cut-off frequency
 - Due to the symmetry we can choose it to be $\,\omega_c = 0.5\pi\,$
- Compute

$$\Delta \omega = \omega_{\rm s} - \omega_{\rm p} = 0.2\pi$$

$$A = -20\log_{10} \delta = \underline{60}$$

And Kaiser window parameters

$$\beta = 5.653$$

$$M = 37$$

Then the impulse response is given as wind

$$h(n) = h_{\lambda}(n)w(n)$$

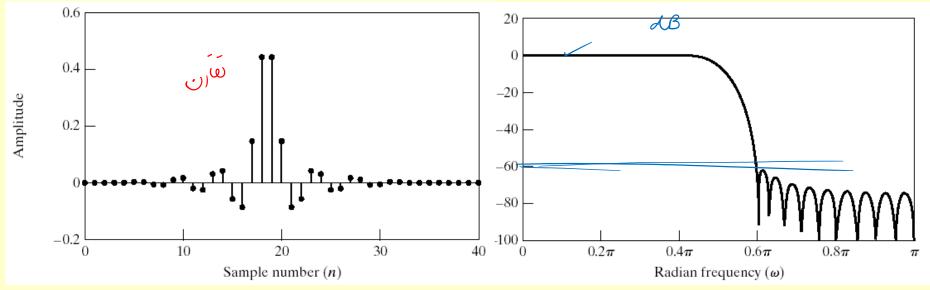
$$h[n] = \begin{cases} \frac{\sin[0.5\pi(n-18.5)]}{\pi(n-18.5)} & I_0 = \frac{10.5\pi(n-18.5)}{10.5\pi(n-18.5)} & 0 \le n \le M \\ \frac{10.5.653}{10.5\pi(n-18.5)} & 0 \le n \le M \end{cases}$$

$$\frac{10.5\pi(n-18.5)}{\pi(n-18.5)} & 0 \le n \le M$$

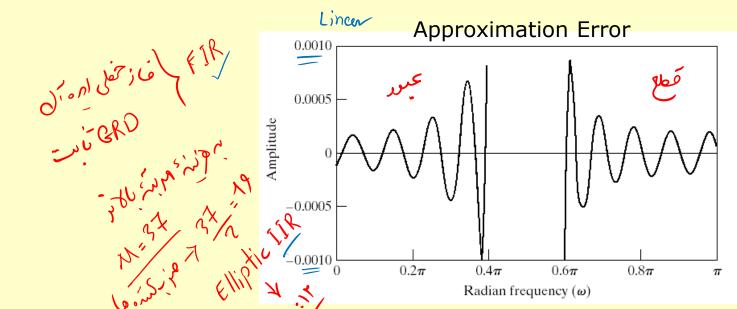
$$\frac{10.5.653}{10.5\pi(n-18.5)} & 0 \le n \le M$$

$$\frac{10.5.653}{10.5\pi(n-18.5)} & 0 \le n \le M$$

Example Cont'd



351M Digital Signal Processing



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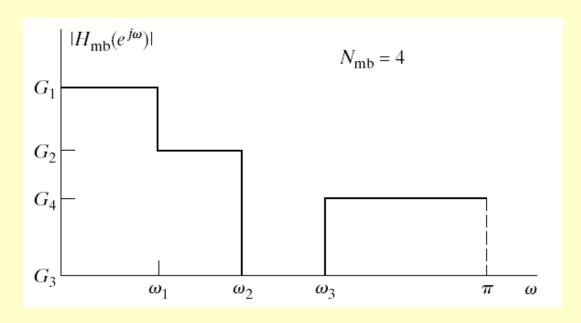
Kaiser : 5 weel

General Frequency Selective Filters

A general multiband impulse response can be written as

$$h_{mb}[n] = \sum_{k=1}^{N_{mb}} (G_k - G_{k+1}) \frac{\sin \omega_k (n - M/2)}{\pi (n - M/2)}$$

- Window methods can be applied to multiband filters
- Example multiband frequency response
 - Special cases of
 - Bandpass
 - Highpass
 - Bandstop



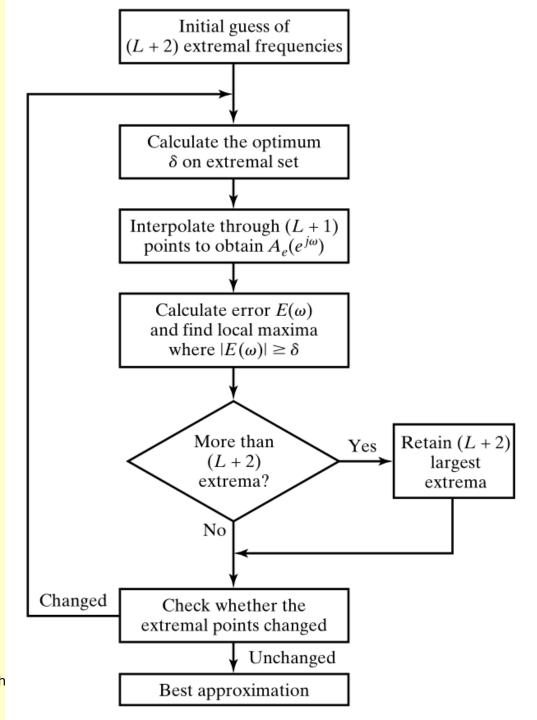


Figure 50 Flowchart of Parks—McClellan algorithm.

Parks-McClellan

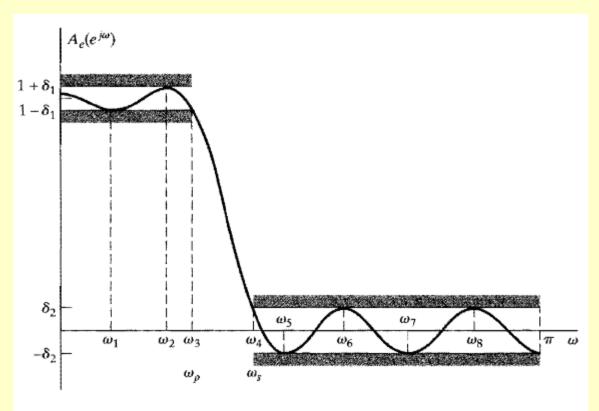


Figure 7.44 Typical example of a lowpass filter approximation that is optimal according to the alternation theorem for L=7.

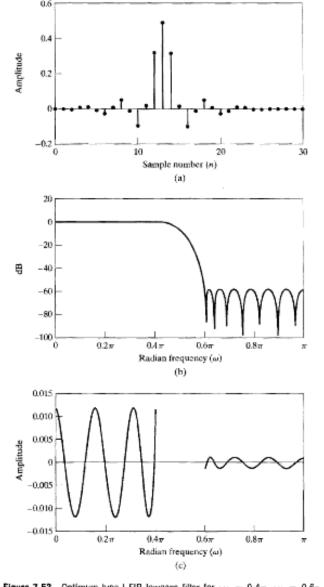


Figure 7.52 Optimum type I FIR lowpass filter for $\omega_{B}=0.4\pi$, $\omega_{3}=0.6\pi$, K=10, and M=26. (a) Impulse response. (b) Log magnitude of the frequency response. (c) Approximation error (unweighted).

مثال

passband edge frequency $\omega_p = 0.22\pi$ stopband edge frequency $\omega_s = 0.29\pi$ maximum passband gain = 0 dBminimum passband gain = -1 dBmaximum stopband gain = -40 dB.

TABLE 7.3 ORDERS OF DESIGNED FILTERS.				
Filter design	Order			
Butterworth	18			
Chebyshev I	8			
Chebyshev II	8			
Elliptic	5			
Kaiser	63			
Parks-McClellan	44			

