

EE482: Digital Signal Processing Applications

FIR Design

Outline

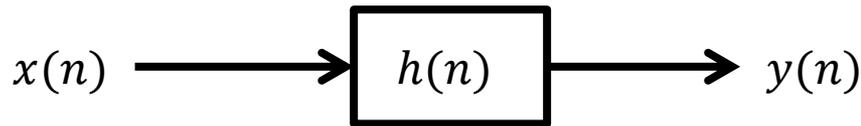
- Filter Characteristics
- Filter Types
- Linear Phase Filters
- Design of FIR Filters
- Window Functions

Why FIR Filters?

- Always stable
 - Finite length
- Linear phase property is guaranteed
 - Even/odd symmetry
- Finite precision errors are less severe
 - No feedback
- FIR filtering is efficient for implementation
- Modern filter design is FIR design

Filter Characteristics

- Remember the LTI system



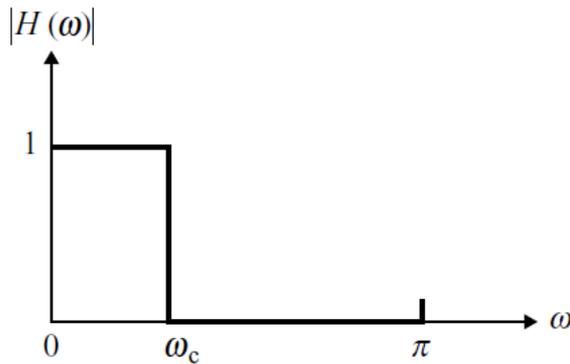
- Transient response
 - Rising-time – how fast output can change (changing rate)
 - Settling-time – how long to settle to stable value
 - Overshoot – if output goes over the desired value

- Steady-state response

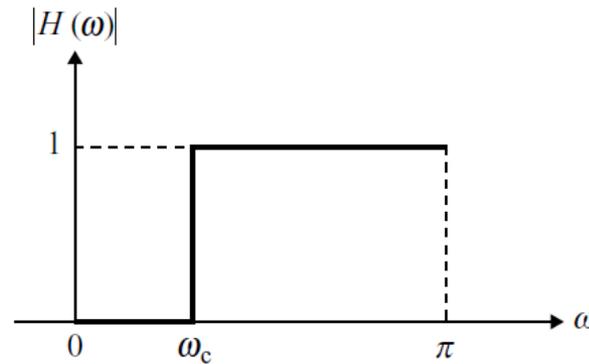
- $Y(\omega) = H(\omega)X(\omega)$
 - Magnitude response
 - $|Y(\omega)| = |H(\omega)||X(\omega)|$
 - Phase response
 - $\Phi_Y(\omega) = \Phi_H(\omega) + \Phi_X(\omega)$
 - Group delay
 - $T_d(\omega) = -\frac{d\Phi_H(\omega)}{d\omega}$
 - Constant group delay for linear phase \rightarrow no phase distortion
 - Linear phase filters
 - $\Phi_H(\omega) = -\alpha\omega$, or $\pi - \alpha\omega$
 - All frequencies delayed by same amount
 - Simple phase relationship indicates a time shift by α
 - $y(n) = x(n - \alpha)$

Filter Types

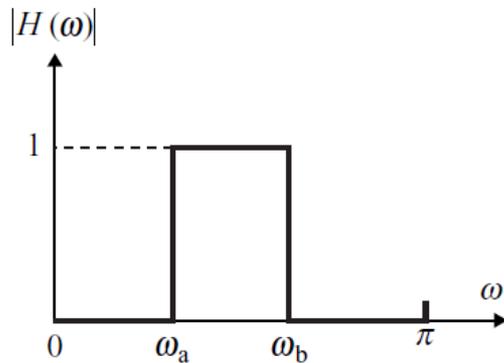
- Ideal filters



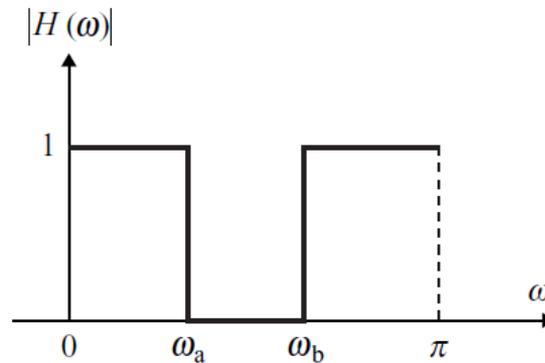
(a) Lowpass filter



(b) Highpass filter



(c) Bandpass filter

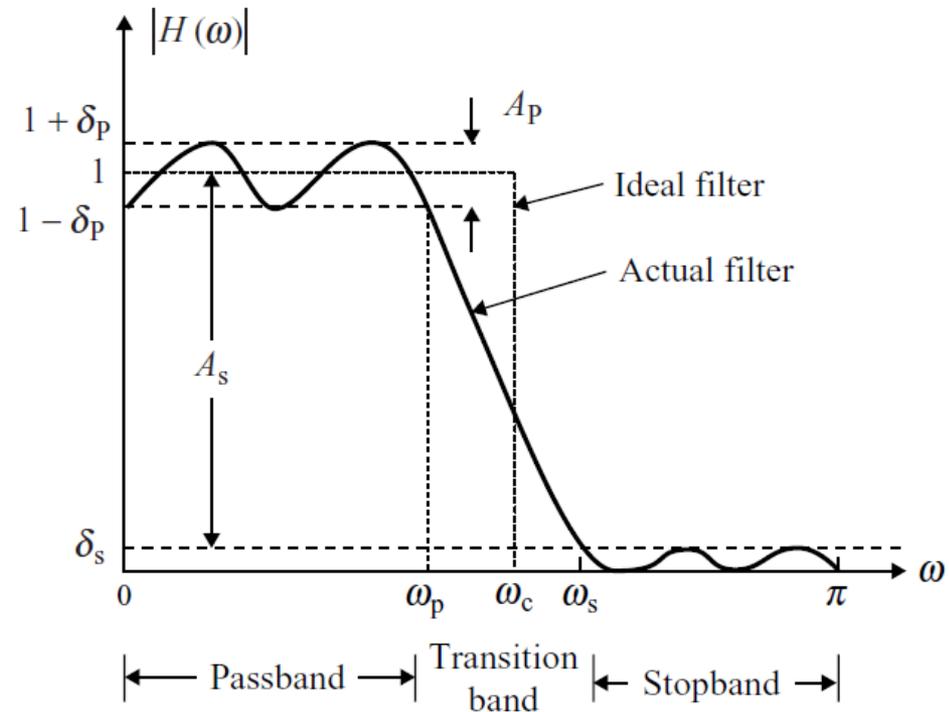


(d) Bandstop filter

- Defined in terms of magnitude response
- Note: only $[0, \pi]$ given because with real filter coefficients $H(\omega)$ is even symmetric across $\omega = 0$
- Remember this is 2π periodic
- Bandstop with a narrow band is called a notch filter
- Allpass filter has $|H(\omega)| = 1, \forall \omega$

Filter Specifications

- Defined by magnitude response
- Must give a tolerance scheme
 - Cannot practically make ideal filters with sharp transitions
- ω_p - passband edge frequency
- ω_s - stopband edge frequency
- δ_p - passband ripple
 - $A_p = 20 \log_{10} \left(\frac{1+\delta_p}{1-\delta_p} \right) dB$
- δ_s - stopband attenuation
 - $A_s = -20 \log_{10} \delta_s dB$



- $1 - \delta_p \leq |H(\omega)| \leq 1 + \delta_p \quad 0 \leq \omega \leq \omega_p$
- $|H(\omega)| \leq \delta_s \quad \omega_s \leq \omega \leq \pi$

Linear Phase FIR Filters

- Systems have symmetry which can be exploited
- Even
 - $b_l = b_{L-1-l}, l = 0, 1, \dots, L-1$
- Odd
 - $b_l = -b_{L-1-l}, l = 0, 1, \dots, L-1$
- Group delay is constant
 - $T_d(\omega) = M = \begin{cases} L/2 & L \text{ even} \\ \frac{L-1}{2} & L \text{ odd} \end{cases}$

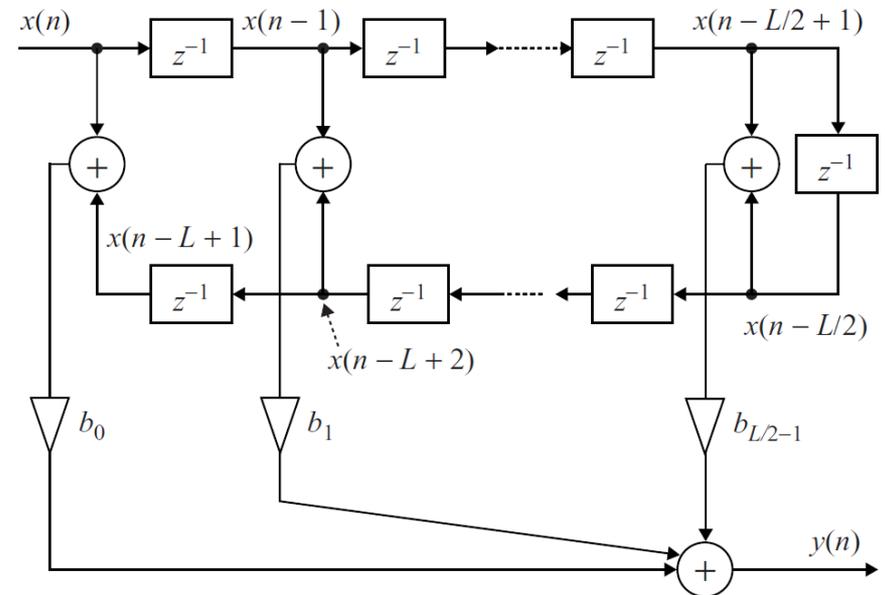


Figure 3.5 Signal-flow diagram of symmetric FIR filter; L is an even number

- Less multiplications are required because coefficients are shared

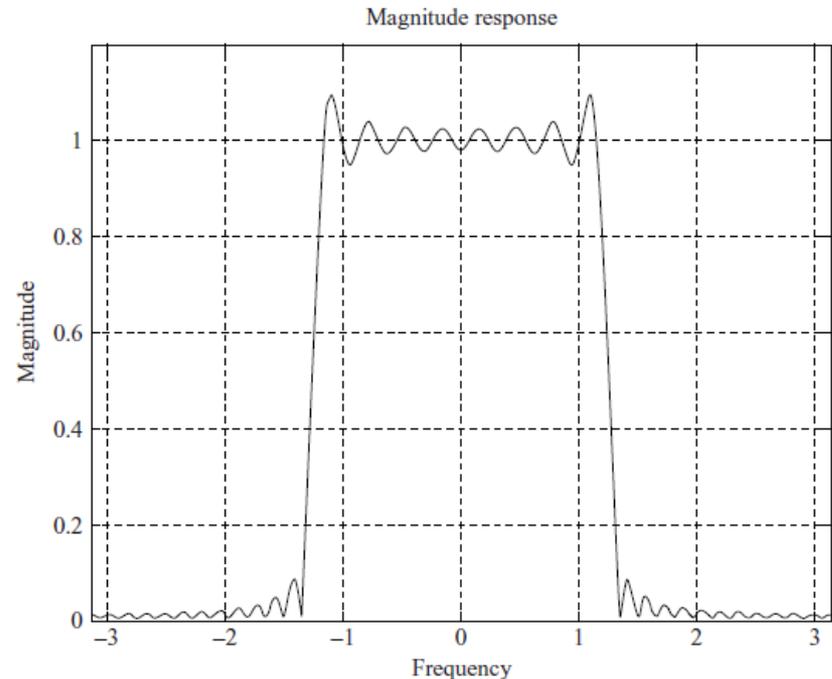
Design of FIR Filters

- Fourier series (windowing) method
 - Find a desired impulse response from desired frequency response
 - $H_d(\omega) = \sum_{n=-\infty}^{\infty} h_d(n) e^{-j\omega n}$
 - $h_d(n) = \int_{-\pi}^{\pi} H_d(\omega) e^{j\omega n} d\omega$
- Notice the impulse response is in general infinite
 - Can make this finite only taking some of the samples (truncate)
 - $$h(n) = \begin{cases} h_d(n) & -M \leq n \leq M \\ 0 & \text{else} \end{cases}$$
 - This can be made causal by shifting to the right by M samples
 - $b_l = h(l - M), \quad l = 0, \dots, 2M$
- Notice that $h(n)$ can be thought of as FS coefficients for $H_d(\omega)$
 - More coefficients, better approximation

Examples

- Example 3.5
- Design a LP filter using windowing
- $$H_d(\omega) = \begin{cases} 1 & |\omega| \leq \omega_c \\ 0 & \text{else} \end{cases}$$
- Use FT equation or in a Table of common pairs
- $$h_d(n) = \sin \frac{\omega_c n}{\pi n} = \frac{\omega_c}{\pi} \text{sinc} \left(\frac{\omega_c n}{\pi} \right)$$
- Window the impulse response and shift to make causal
- $$b_l = \begin{cases} \frac{\omega_c}{\pi} \text{sinc} \left(\frac{\omega_c(l-M)}{\pi} \right) & 0 \leq l \leq L-1 \\ 0 & \text{else} \end{cases}$$

- Example 3.7
- Design a LP filter with $\omega_c = 0.4\pi$ with $L = 61$.
 - $M = \frac{L-1}{2} = 30$
 - $b_l = 0.4 \text{sinc}(0.4(l-30))$
 - $l = 0, 1, \dots, 60$



Windowing Approximation Accuracy

- Notice the rippling effect known as Gibbs phenomenon
- Windowing is equivalent to multiplication in time domain
 - $h(n) = h_d(n)w(n)$
 - Rectangular window
 - $w(n) = \begin{cases} 1 & -M \leq n \leq M \\ 0 & \text{else} \end{cases}$
- Multiplication in time is convolution in frequency domain
 - $H(\omega) = \frac{1}{2\pi} H_d(\omega) * W(\omega)$
 - $W(\omega) = \frac{\sin\left(\frac{(2M+1)}{2}\omega\right)}{\sin\frac{\omega}{2}}$

Windowing in Frequency Domain

- $H(\omega) = \frac{1}{2\pi} H_d(\omega) * W(\omega)$
 - Ideal frequency response is smoothed by window DTFT

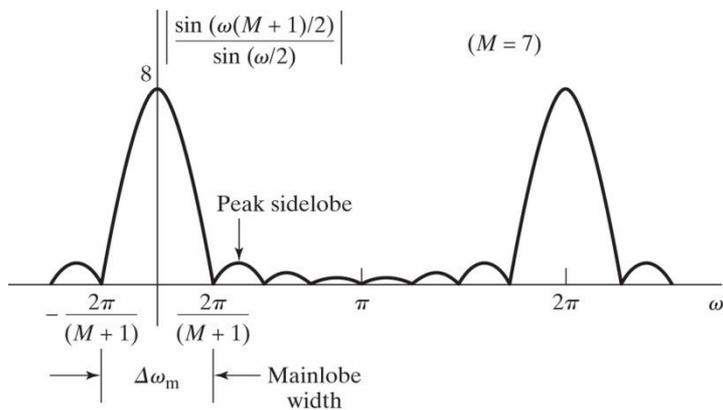


Figure 7.28 Magnitude of the Fourier transform of a rectangular window ($M=7$).

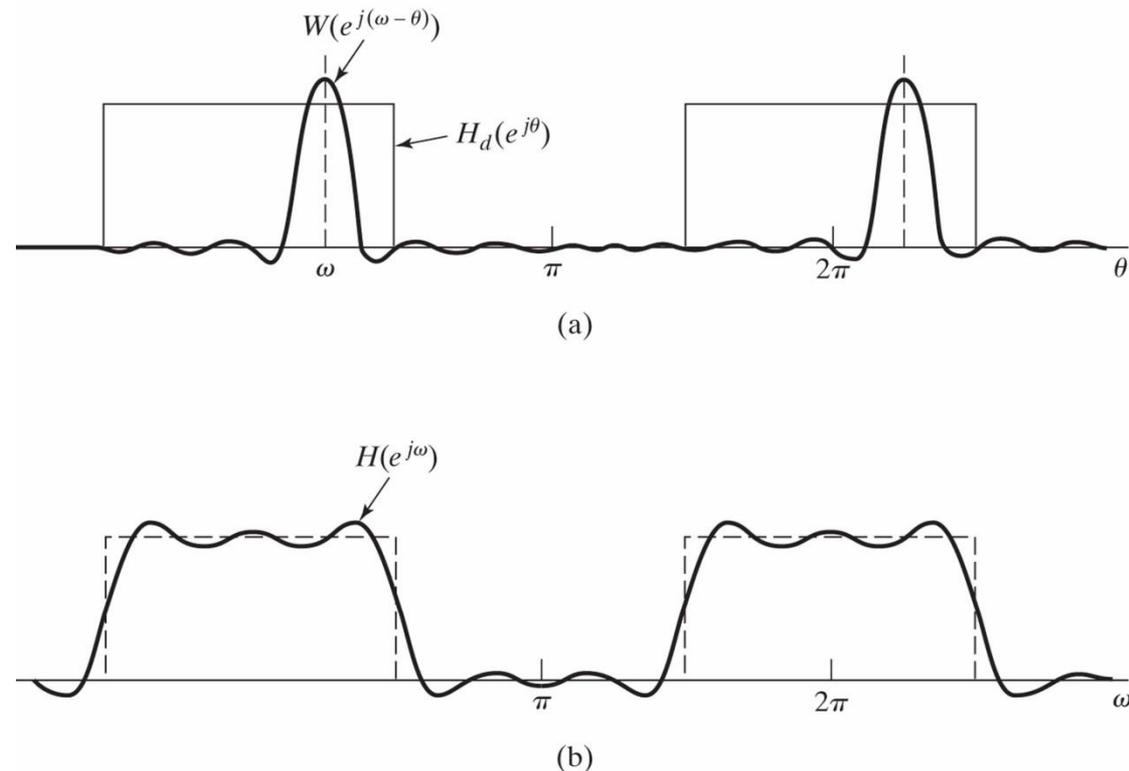
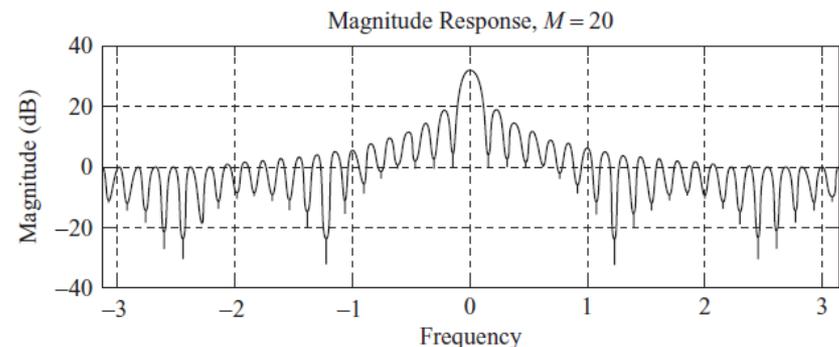
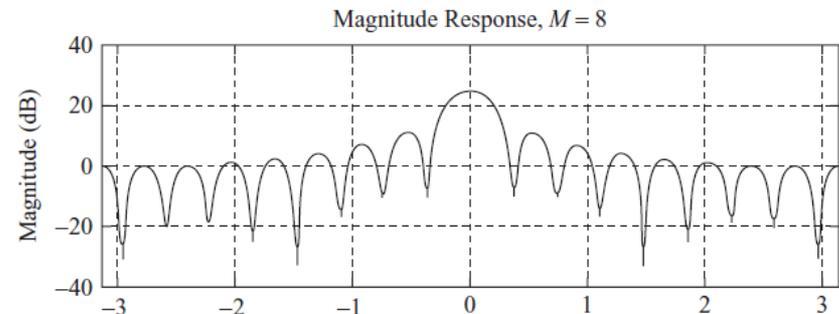


Figure 7.27 (a) Convolution process implied by truncation of the ideal impulse response. (b) Typical approximation resulting from windowing the ideal impulse response.

Rectangular Window

- $W(\omega) = \frac{\sin\left(\frac{(2M+1)\omega}{2}\right)\omega}{\sin\frac{\omega}{2}}$
- This window spectrum has ripples which causes ripples in $H(\omega)$ at sharp transitions
 - Can't make perfectly sharp edges
- Mainlobe – centered at $\omega = 0$
 - Care about width
- Sidelobes – all other ripples
 - Care about height
- Gibbs phenomenon can be managed by smoothing the window edges
 - Results in lower sidelobe height and increased mainlobe width
 - Larger transition width at discontinuity but less ringing



Normalized frequency

Windowing Design Considerations

- $H(\omega) = \frac{1}{2\pi} H_d(\omega) * W(\omega)$
 - Ideal frequency response is smoothed by window DTFT
- The quality of the FIR approximation is dependent on two factors
 - The width of the main lobe
 - The peak side-lobe amplitude
- Want narrow main-lobe with small side lobe amplitude
 - More impulse-like
 - Cannot optimize both at the same time
- $N\Delta_f = c$
 - N – length of filter
 - See Shaum's DSP notes

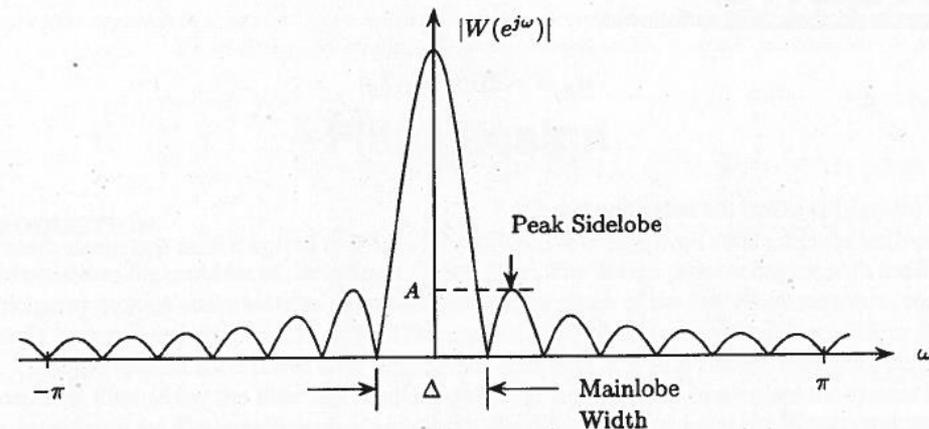


Fig. 9-2. The DTFT of a typical window, which is characterized by the width of its main lobe, Δ , and the peak amplitude of its side lobes, A , relative to the amplitude of $W(e^{j\omega})$ at $\omega = 0$.

- Increasing length of window the decreases the width of the mainlobe
 - Decreases width of the transition band
- Peak sidelobe amplitude is practically independent of length only depends on shape of window
 - Decrease in sidelobe amplitude results in greater mainlobe width

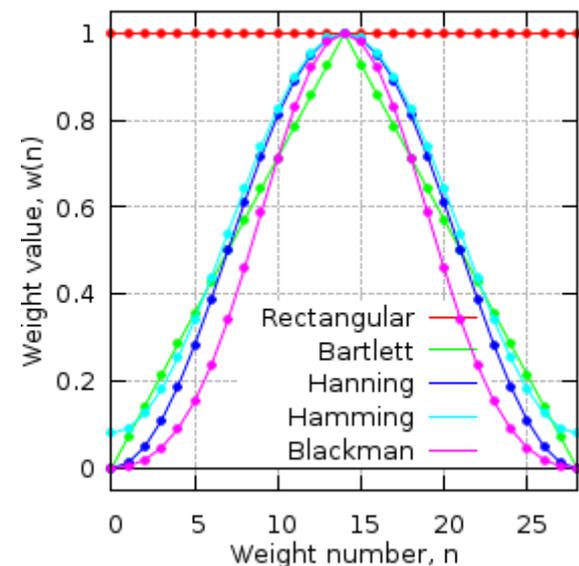
Window Functions

- Many windows have been designed to trade off mainlobe width and sidelobe height
 - All have smooth transitions at edge of window

Table 9-1 Some Common Windows

Rectangular	$w(n) = \begin{cases} 1 & 0 \leq n \leq N \\ 0 & \text{else} \end{cases}$
Hanning ¹	$w(n) = \begin{cases} 0.5 - 0.5 \cos\left(\frac{2\pi n}{N}\right) & 0 \leq n \leq N \\ 0 & \text{else} \end{cases}$
Hamming	$w(n) = \begin{cases} 0.54 - 0.46 \cos\left(\frac{2\pi n}{N}\right) & 0 \leq n \leq N \\ 0 & \text{else} \end{cases}$
Blackman	$w(n) = \begin{cases} 0.42 - 0.5 \cos\left(\frac{2\pi n}{N}\right) + 0.08 \cos\left(\frac{4\pi n}{N}\right) & 0 \leq n \leq N \\ 0 & \text{else} \end{cases}$

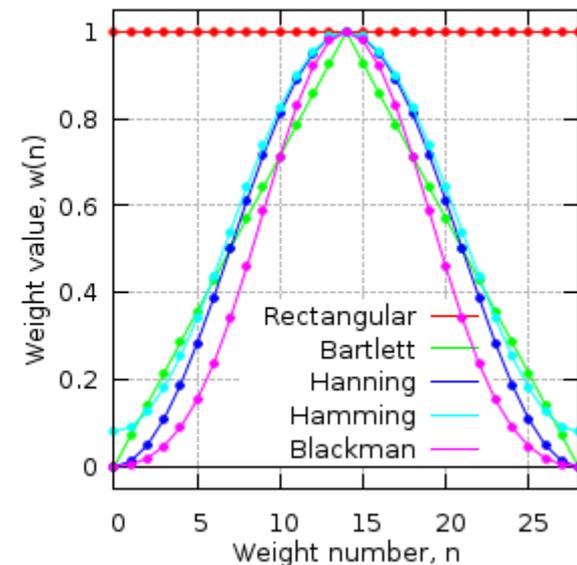
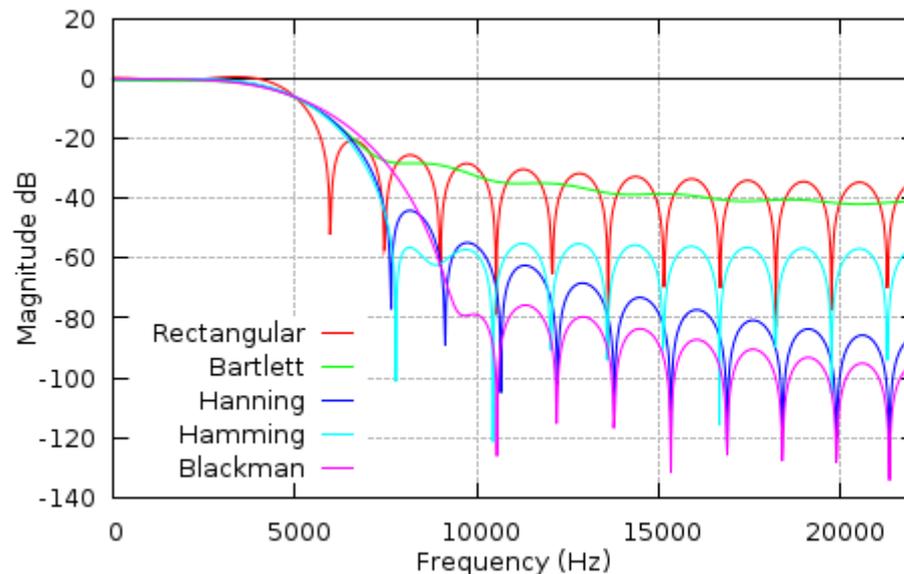
¹In the literature, this window is also called a Hann window or a von Hann window.



Window Performance

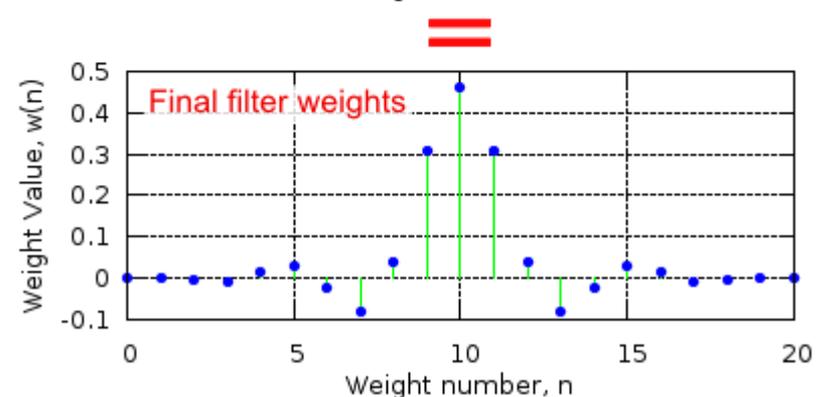
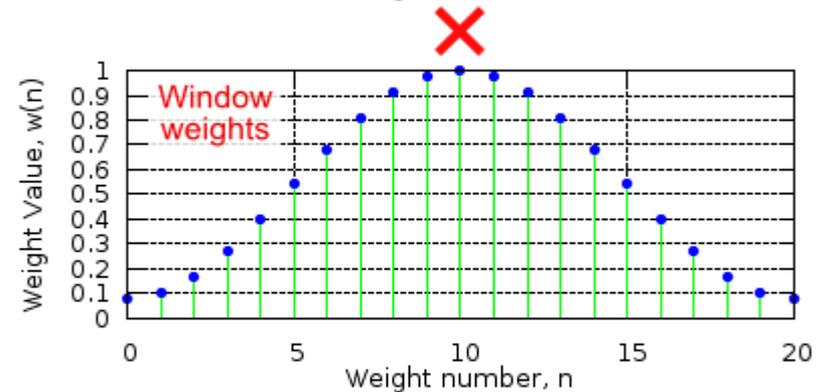
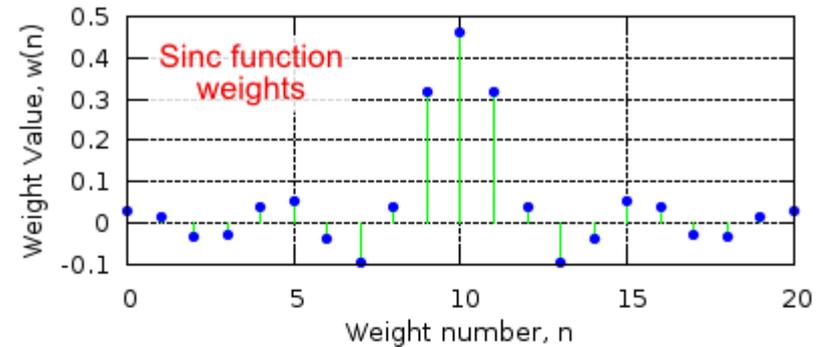
Table 9-2 The Peak Side-Lobe Amplitude of Some Common Windows and the Approximate Transition Width and Stopband Attenuation of an N th-Order Low-Pass Filter Designed Using the Given Window.

Window	Side-Lobe Amplitude (dB)	Transition Width (Δf)	Stopband Attenuation (dB)
Rectangular	-13	$0.9/N$	-21
Hanning	-31	$3.1/N$	-44
Hamming	-41	$3.3/N$	-53
Blackman	-57	$5.5/N$	-74



FIR Design Steps

1. Select window type to satisfy stopband attenuation requirements
2. Determine window size L based on transition width
3. Calculate window values
4. Calculate impulse response of desired filter
 - Truncate to fixed length L
 - Shift to make causal
5. Calculate final filter coefficients as product of window and desired response
 - $b_l = h_d[l - M]w[l]$



Upsampling/Interpolation

- Increase the sampling rate of a signal by factor L
- Accomplished by inserting zeros into a sequence and then lowpass filtering
 - Zero insertion is upsampling
 - LP filtering is interpolation
- $x_u(n) = \begin{cases} x\left(\frac{n}{L}\right) & n = 0, \pm L, \pm 2L, \dots \\ 0 & \text{else} \end{cases}$
 - Resulting signal has more samples but gaps between values
- LP filter using gain L and cutoff $= \pi/L$
 - Gain of L to “spread” sample energy to neighbor zeros

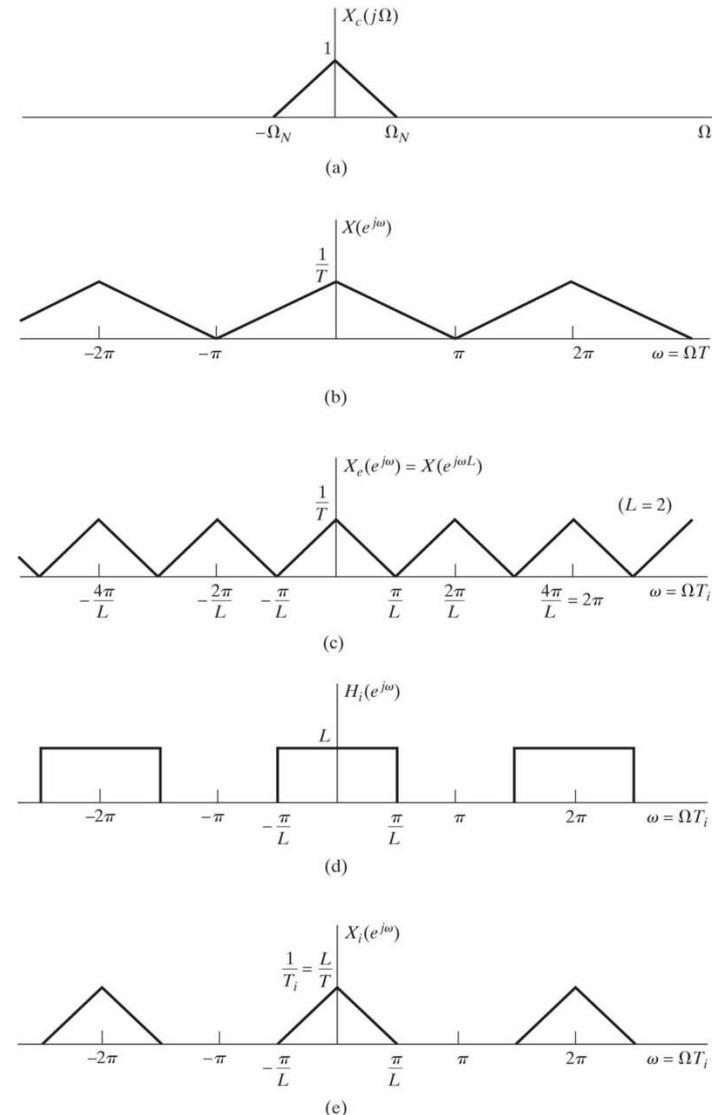


Figure 4.24 Frequency-domain illustration of interpolation.

Downsampling/Decimation

- Reduce the sampling rate of a signal by factor M
- Accomplished by dropping samples
- $x_d(n) = x(nM)$
- Remember bandwidth is controlled by sampling rate
 - Both sampling rate and bandwidth decrease by factor M
 - This may result in aliasing of the signal
- Avoid aliasing by pre-filtering signal with LP filter with cutoff $= \pi/M$ before decimation

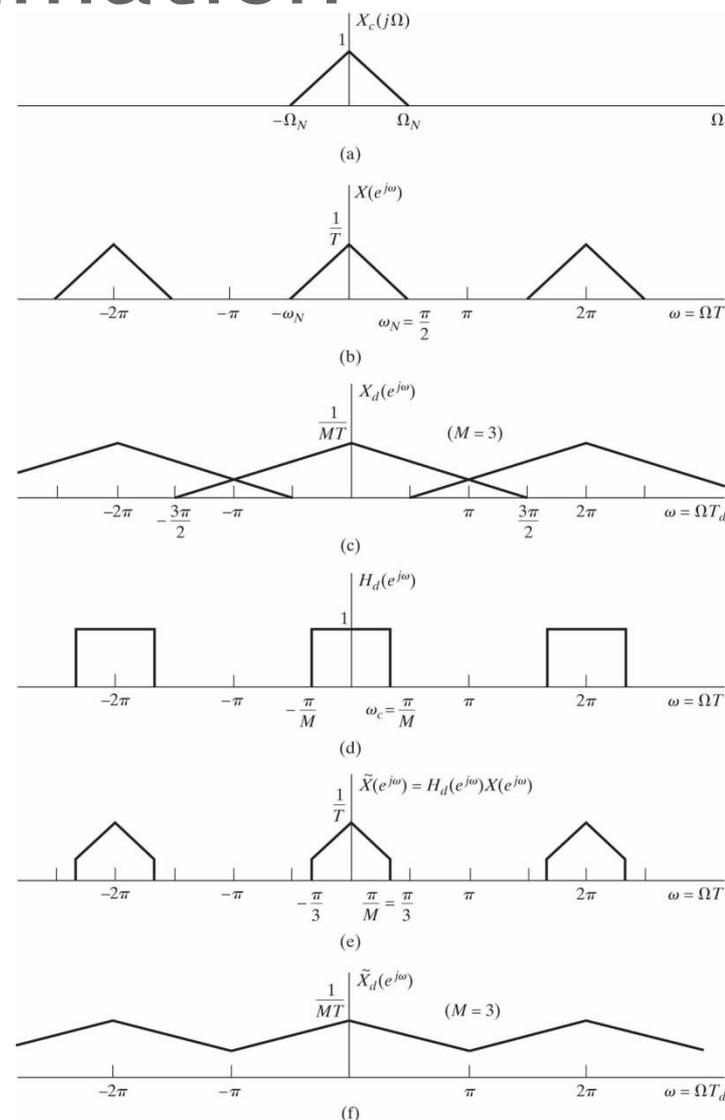


Figure 4.21 (a)–(c) Downsampling with aliasing. (d)–(f) Downsampling with pre-filtering to avoid aliasing.

Arbitrary Sample Rate Conversion

- Conversion to arbitrary sample rate is possible
 - $R = U/D$
 - Must find appropriate upsample factor U and downsample factor D
- First perform interpolation followed by decimation
 - Minimize reduction in signal bandwidth
 - No fear of aliasing in upsample
 - Downsampling first could result in loss of high frequency content
- Can combine interpolation LP filter with LP for decimation
 - Cutoff should be minimum of either operation
- Use Matlab `interp.m`, `decimate.m`, and `upfindn.m/resample.m`