

EEO 401

Digital Signal Processing

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Note Set #23

- Windows for Spectral Analysis of Signals
- Reading Assignment: Sect. 7.4 of Proakis & Manolakis
Ch. 6 of Porat's Book

Common Windows

Porat Section 6.3

Desirable Window Properties

We've seen that to minimize the impact of a window we need the DTFT of the window $W^f(\theta)$ to have:

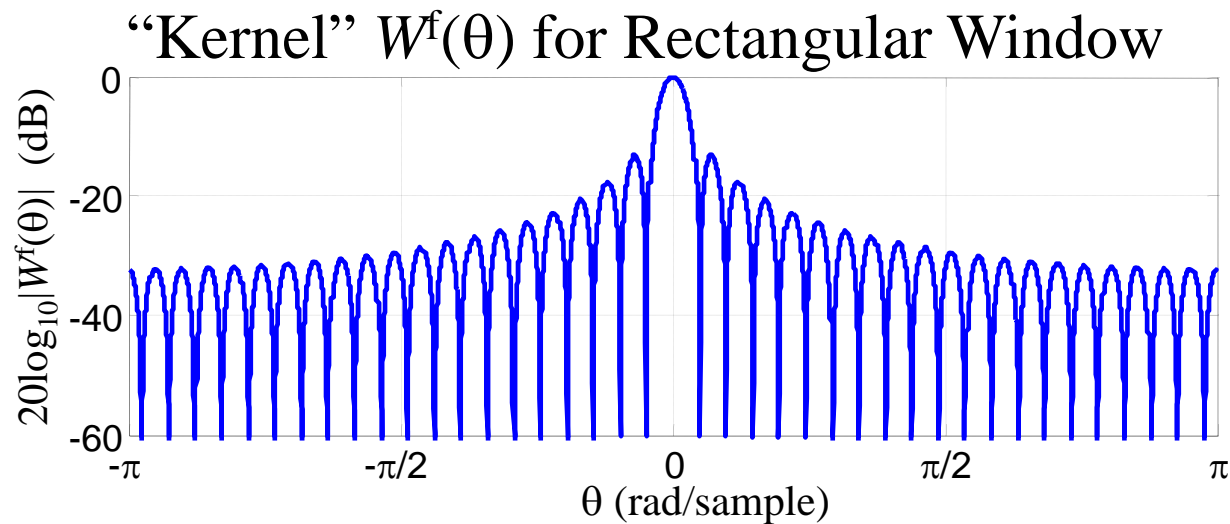
- Narrow Mainlobe
 - Mainlobe Width *usually* measured “zero-to-zero”
- Small Sidelobe Levels
 - Measured in dB relative to mainlobe peak
 - Care about “Highest Sidelobe” & “Drop-off Rate”

We'll see that there is an inherent trade-off between these two desires:

Lowering the Sidelobes Causes a Widening of the Mainlobe

Rectangular Window

This is what you get if you don't explicitly apply some other type of window – it is due to the fact that you have only N signal samples available.



- Mainlobe Width = $4\pi/N$

Good!!!

- Sidelobe Levels

- Largest Sidelobe = -13 dB

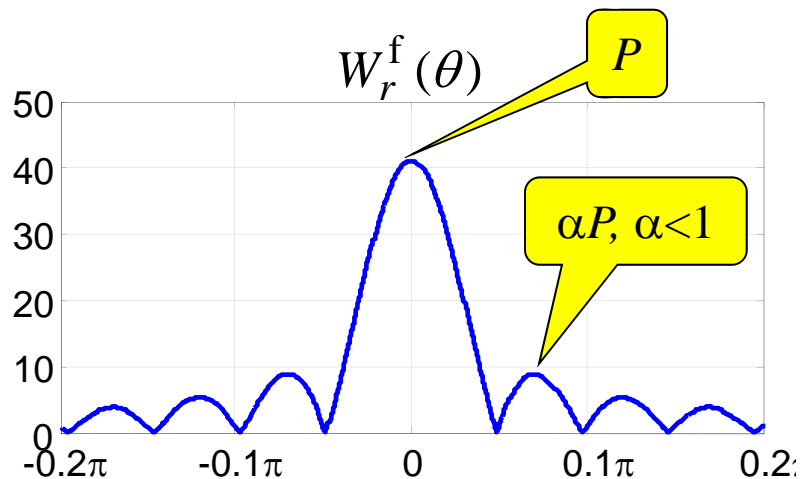
- Sidelobe Drop-off Rate = -6 dB/octave (except near $\pm \pi$)

Bad!!!

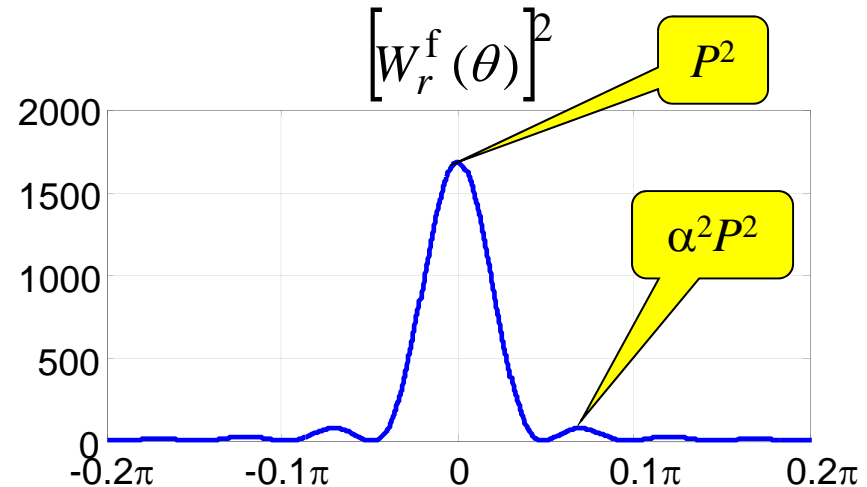
Need to get these lower!!!
But HOW????

Bartlett Window

Inspiration: Square the (non-dB) rect. kernel

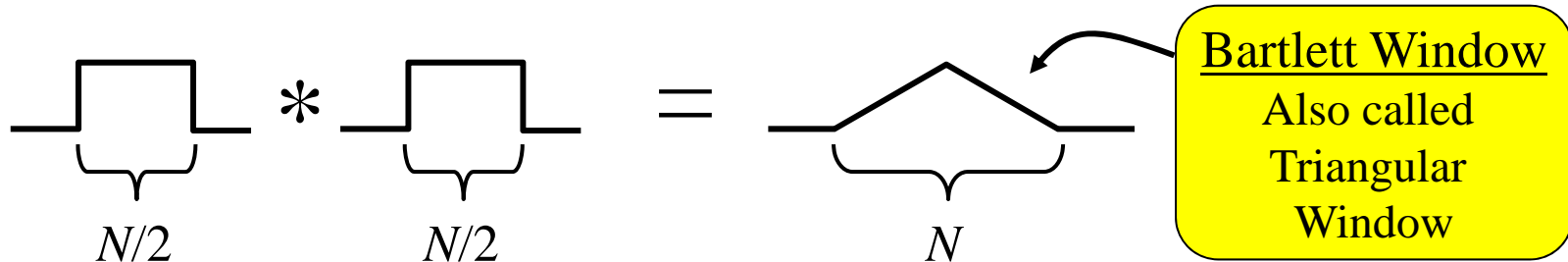


Sidelobe Ratio = $\alpha P / P = \alpha$



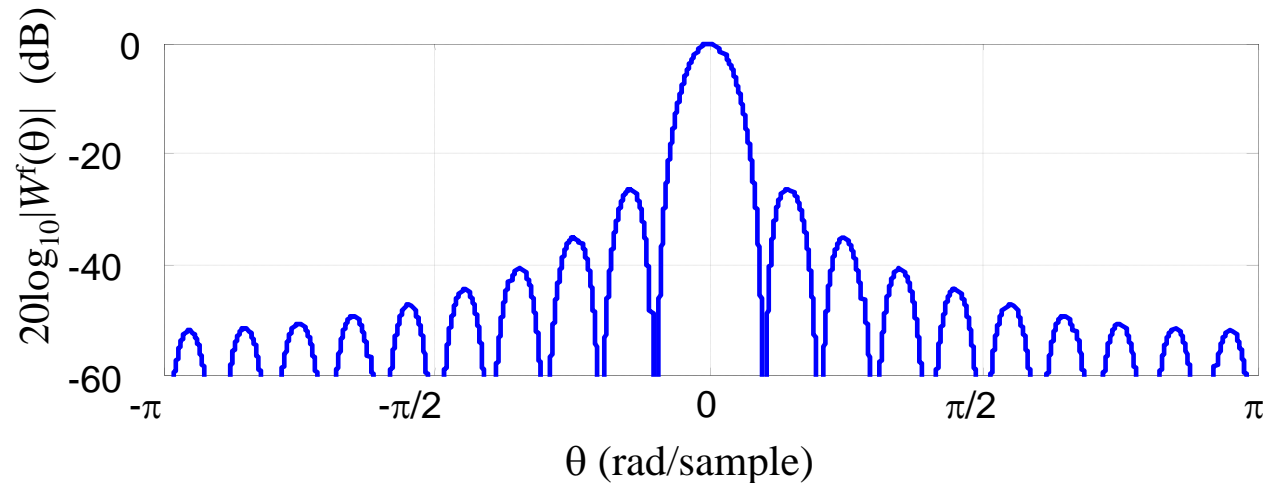
Sidelobe Ratio = $\alpha^2 P^2 / P^2 = \underline{\alpha^2} < \underline{\alpha}$

So... in time-domain this corresponds to convolving 2 rect. windows:



Bartlett Window (pt. 2)

“Kernel” $W^f(\theta)$ for Bartlett Window



- Mainlobe Width = $8\pi/(N+1)$

$\approx 2 \times$ Wider Than Rect

- Sidelobe Levels

- Largest Sidelobe = -27 dB

- Sidelobe Drop-off Rate = -12 dB/octave (except near $\pm \pi$)

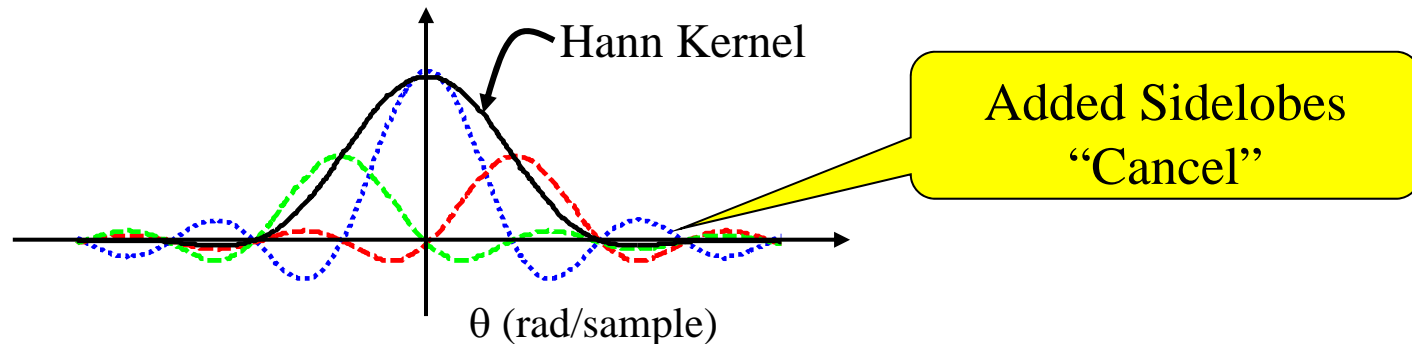
Better than Rect

-27 dB vs. -13 dB

-12 dB/oct vs. -6 dB/oct

Hann Window (also called Hanning)

Inspiration: “Add” three shifted (non-dB) rect. kernels together to try to cancel sidelobes:



$$W_{\text{hn}}^f(\theta) = \underbrace{0.5W_r^f(\theta)}_{\downarrow} - \underbrace{0.25W_r^f\left(\theta - \frac{2\pi}{N-1}\right)}_{\swarrow} - \underbrace{0.25W_r^f\left(\theta + \frac{2\pi}{N-1}\right)}_{\searrow}$$

Use DTFT
Freq. Shift Property

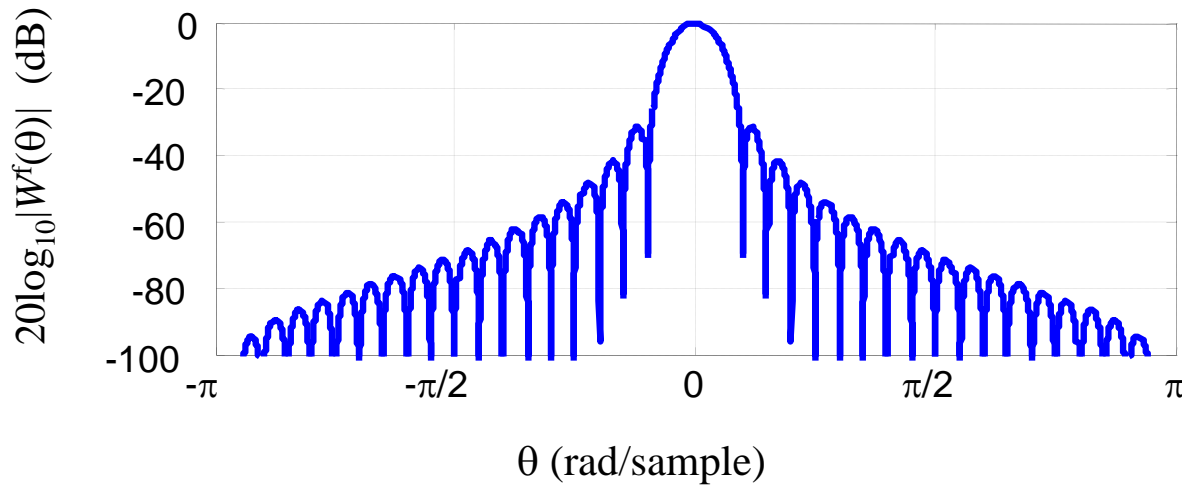
$$w_{\text{hn}}[n] = 0.5 - 0.25e^{j2\pi n/(N-1)} - 0.25e^{-j2\pi n/(N-1)}, \quad 0 \leq n \leq N-1$$

$$= 0.5[1 - \cos\{2\pi n/(N-1)\}]$$

Hann Window

Hann Window (pt. 2)

“Kernel” $W^f(\theta)$ for Hann Window



- Mainlobe Width = $8\pi/(N)$

2 × Wider Than Rect

- Sidelobe Levels

- Largest Sidelobe = -32 dB

- Sidelobe Drop-off Rate = -18 dB/octave (except near $\pm\pi$)

Even Better than Bartlett

-32 dB vs. -27 dB

-18 dB/oct vs. -12 dB/oct

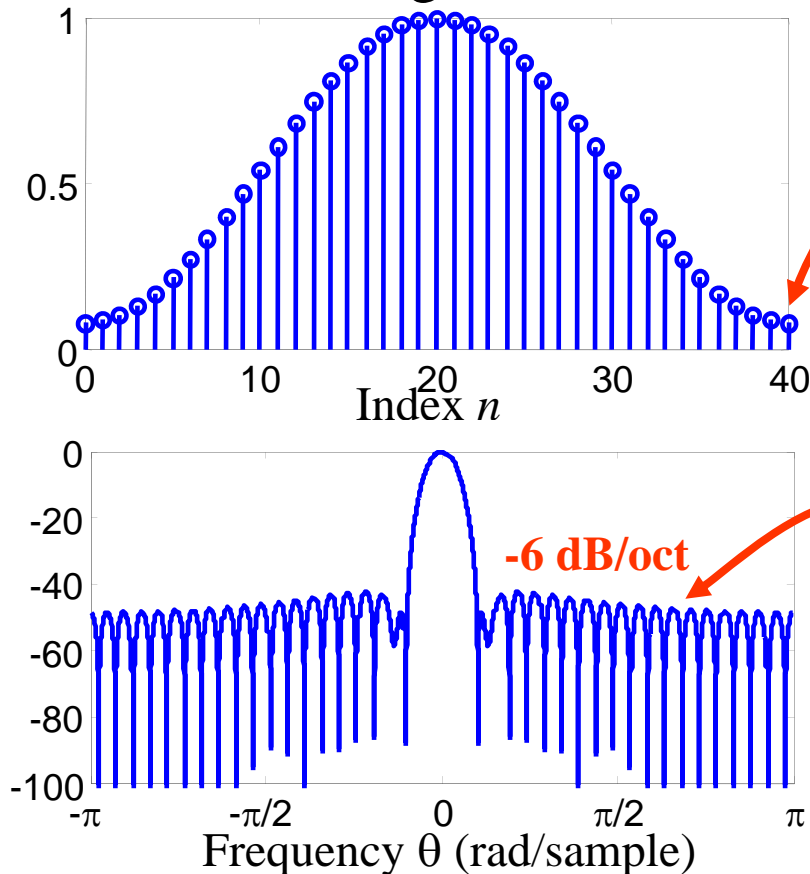
Hamming Window

Inspiration: Tweak Hann coefficients to get lower “highest SL”

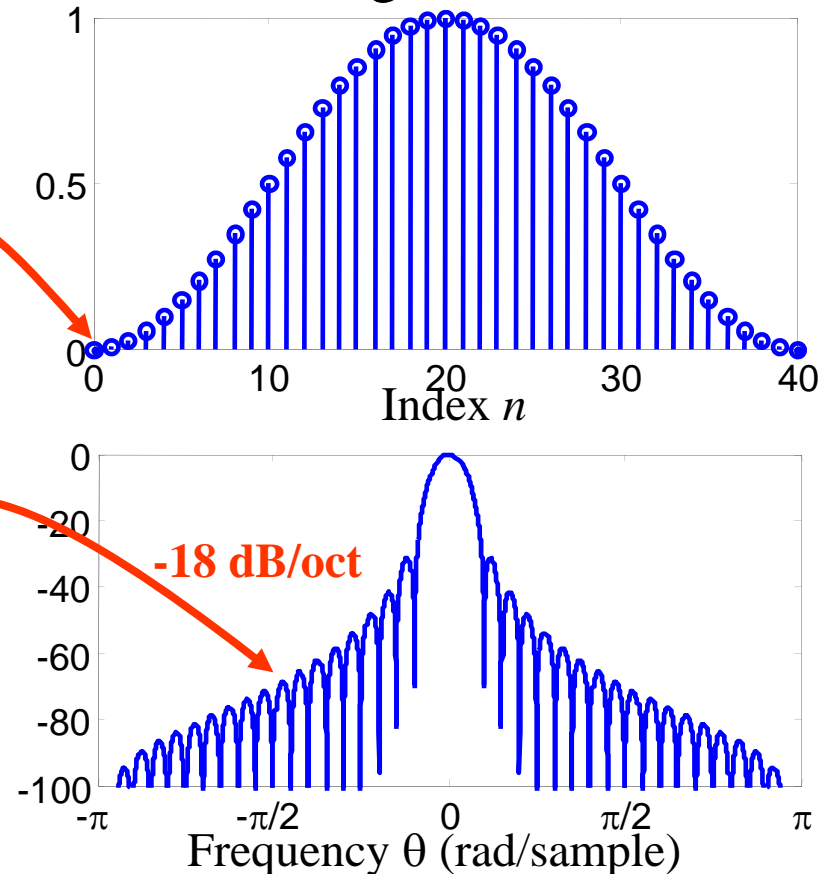
$$W_{\text{hm}}^f(\theta) = 0.54W_r^f(\theta) - 0.23W_r^f\left(\theta - \frac{2\pi}{N-1}\right) - 0.23W_r^f\left(\theta + \frac{2\pi}{N-1}\right)$$

$$w_{\text{hm}}[n] = 0.54 - 0.46\cos\{2\pi n/(N-1)\}$$

Hamming Window



Hanning Window



Hamming Window (pt. 2)

- Mainlobe Width = $8\pi/(N)$

2 × Wider Than Rect
(same as Hanning)

- Sidelobe Levels

- Largest Sidelobe = -43 dB
- Sidelobe Drop-off Rate = -6 dB/octave (except near $\pm \pi$)

Even Better than Hanning
 -43 dB vs. -32 dB

As Bad as Rect!!
 -6 dB vs. -6 dB

Note: Both Rect & Hamming have -6 dB/oct drop-off

Note also: Both are discontinuous at window edge in time-domain

Drop-Off Rate & Discontinuity Order

Definition: If the window's time-domain function is such that up to its $(p-1)^{th}$ derivative (but no higher) is continuous, then we say that the signal has p -order continuity.

Ex. Rectangular Window has 0-order continuity
 Triangular Window has 1-order continuity
 Hamming Window has 0-order continuity

Result: A window that has continuity of order p will (generally) have a kernel that has a sidelobe drop-off rate of $-(p+1)6$ dB/oct

Rectangular Window has 0-order continuity: - 6dB/oct
Hamming Window has 0-order continuity: - 6dB/oct
Triangular Window has 1-order continuity: - 12dB/oct
Hann Window has 2-order continuity: - 18dB/oct

Other Windows & Their Rationale

Lots of effort has been focused on designing good windows.
Here are a few, with their design rationale and their “specs”

Blackman: “More Tweaking of Hann Coefficients”

ML Width = $12\pi/N$ SL Level = -57 dB Drop-Off = -18 dB/oct

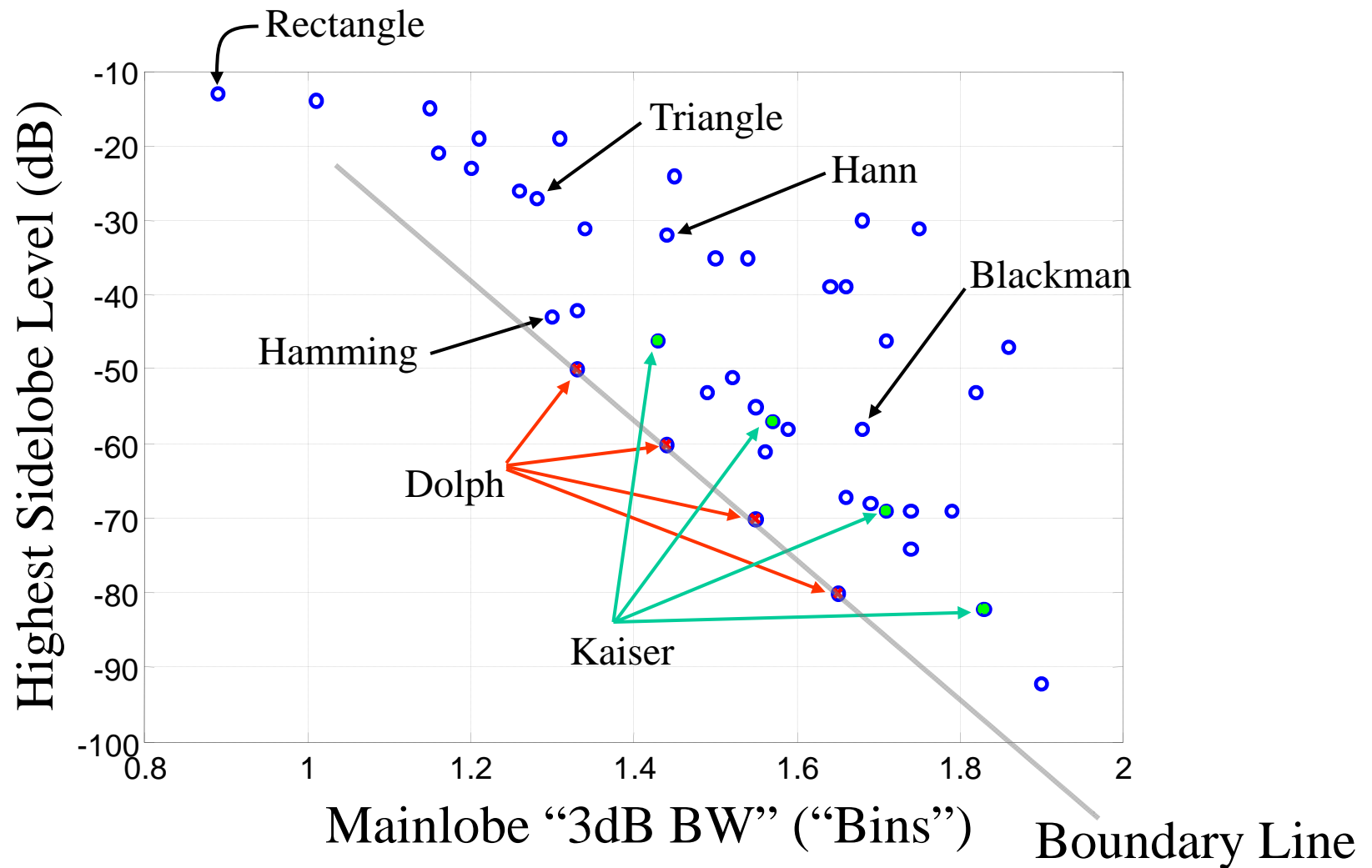
Kaiser: “Minimize width for SL *energy* not exceeding spec’d % of total”

ML Width = variable SL Level = variable Drop-Off = -6 dB/oct

Dolph: “Minimize width for SL *level* not exceeding spec’d level”

ML Width = variable SL Level = variable Drop-Off = 0 dB/oct

Comparison of Windows



Data taken from table in F. J. Harris, "On the use of windows for harmonic analysis with the discrete Fourier transform," *Proc. IEEE*, vol. 66, pp. 51 – 83, January 1978.

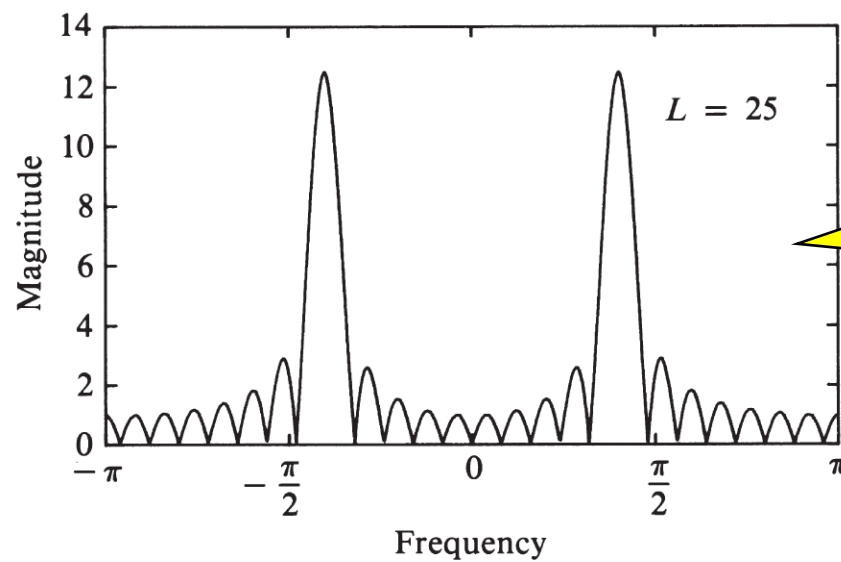
Some Examples from Proakis & Manolakis

Let L be the number of signal samples collected (i.e., “window size”).

Let N be the number of points after zero-padding (i.e. “DFT size”).

$$x[n] = \cos(\omega_o n), \quad n = 0, 1, 2, \dots, L-1$$

**Using
Rectangular
Window**



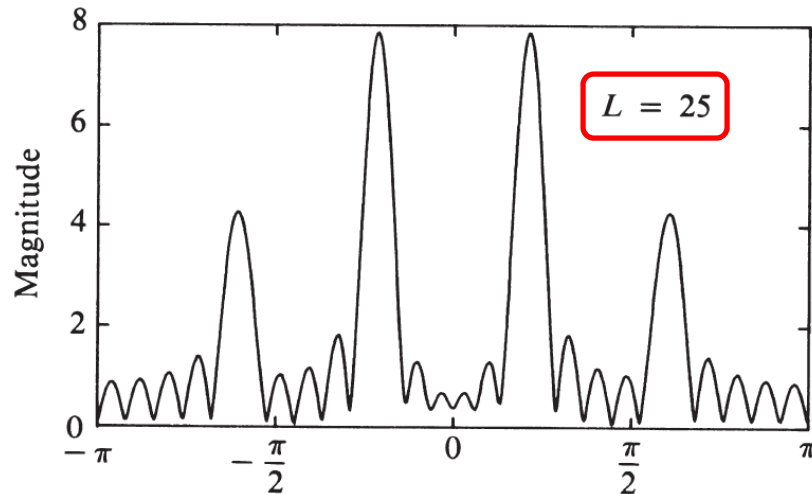
Plotted using
“line” not
“stem”... but
looks smooth
because N is
sufficiently
large!

Figure 7.4.1 Magnitude spectrum for $L = 25$ and $N = 2048$, illustrating the occurrence of leakage.

$$x[n] = \cos(\omega_0 n) + \cos(\omega_1 n) + \cos(\omega_2 n), \quad n = 0, 1, 2, \dots, L-1$$

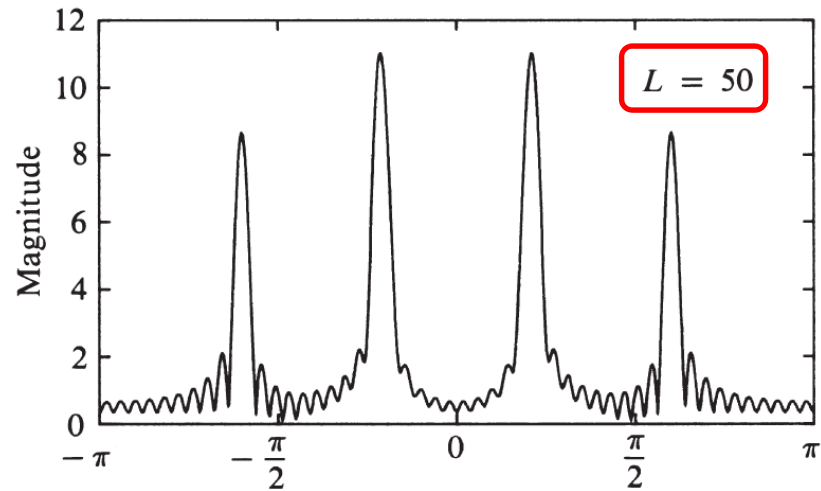
$$\omega_0 = 0.2\pi \quad \omega_1 = 0.22\pi \quad \omega_2 = 0.6\pi$$

$$N = 2048$$



Frequency

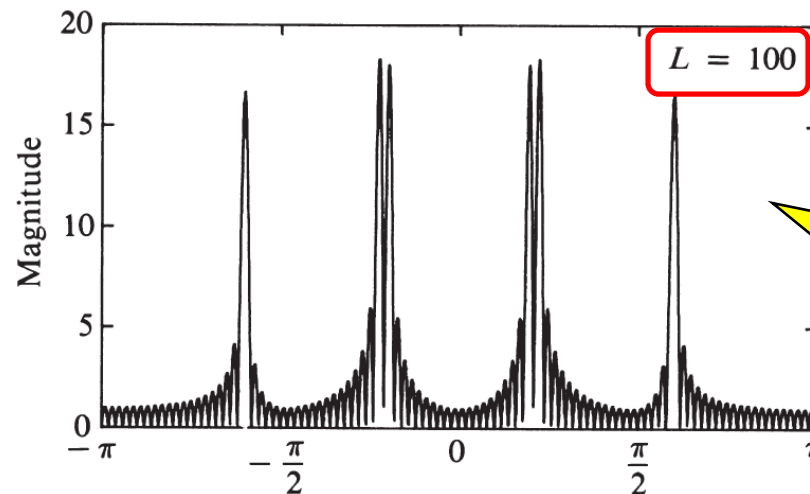
(a)



Frequency

(b)

**Using
Rectangular
Window**

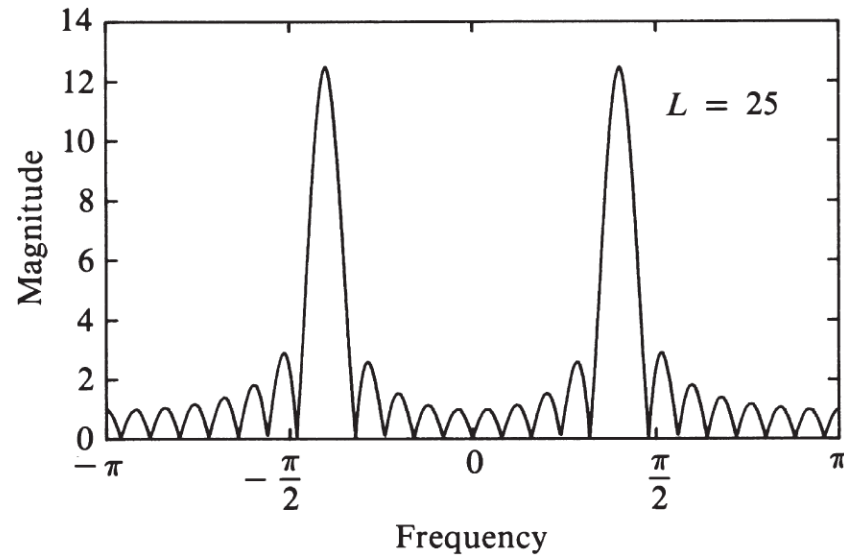


Frequency

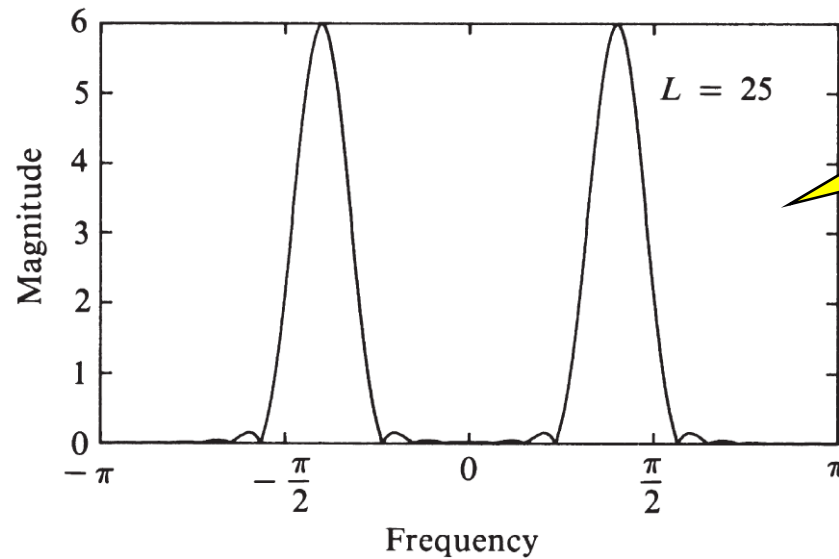
Increasing the amount of actual data allows one to see the separate spikes... because the window kernel gets narrower!

$$x[n] = \cos(\omega_0 n), \quad n = 0, 1, 2, \dots, L-1$$

**Using
Rectangular
Window**



**Using
Hanning
Window**



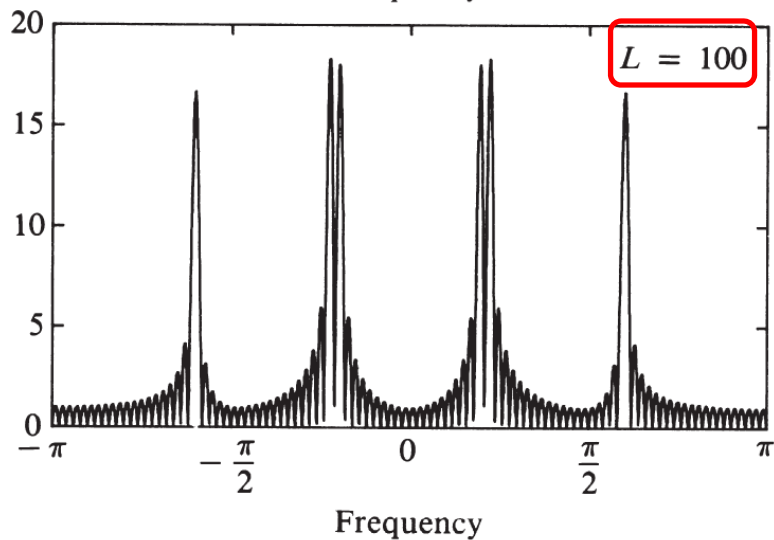
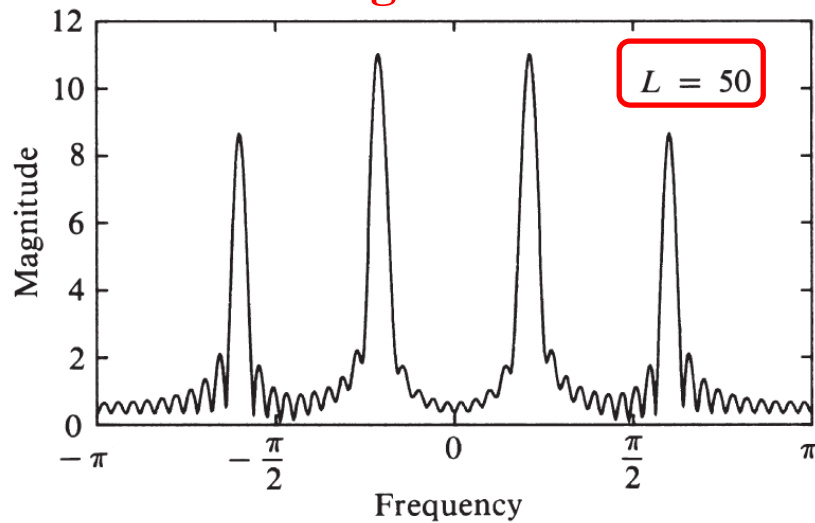
Hanning gives
lower sidelobes
at the expense of
wider mainlobes!

$$x[n] = \cos(\omega_0 n) + \cos(\omega_1 n) + \cos(\omega_2 n), \quad n = 0, 1, 2, \dots, L-1$$

$$\omega_0 = 0.2\pi \quad \omega_1 = 0.22\pi \quad \omega_2 = 0.6\pi$$

$$N = 2048$$

Rectangular Window



Hanning Window

