

THE DISCRETE FOURIER TRANSFORM (DFT) LECTURE 2

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Chapter 9 of Textbook -- part II

(original material from John Thompson) ₁

Summary

- DFT computation
- Analogies for the DFT
- Leakage and the use of windows

DFT Matrix Equation

$$\begin{array}{l}
 X(0) \\
 X(1) \\
 X(2) \\
 X(3) \\
 X(4) \\
 X(5) \\
 X(6) \\
 X(7)
 \end{array}
 \left| \begin{array}{c} \\ \\ \\ \\ \\ \\ \\ \\ \end{array} \right.
 =
 \left| \begin{array}{cccccccc}
 \Rightarrow & \Rightarrow & \Rightarrow & \Rightarrow & \Rightarrow & \Rightarrow & \Rightarrow & \Rightarrow \\
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 \end{array} \right.
 \left| \begin{array}{c}
 x(0) \\
 x(1) \\
 x(2) \\
 x(3) \\
 x(4) \\
 x(5) \\
 x(6) \\
 x(7)
 \end{array} \right.$$

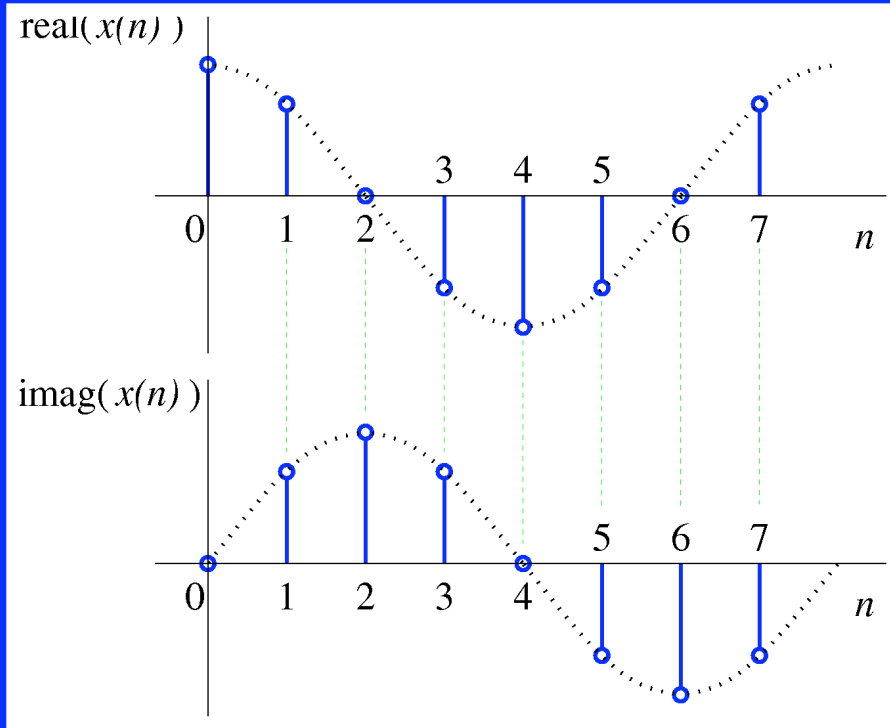
Fig
9.4

- First line of DFT matrix is dc, second is one cycle in N samples and so on

DFT Calculation

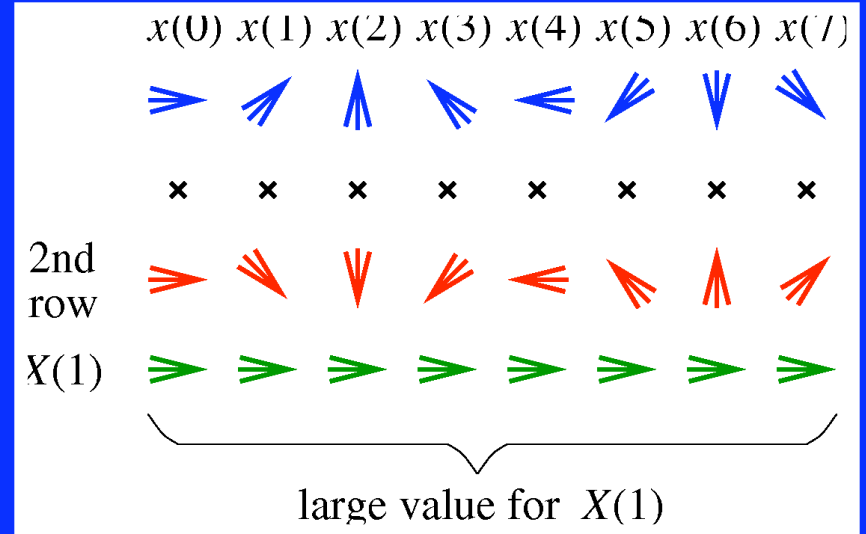
- An input signal $\exp(j\omega_f n\Delta t)$ rotates anti-clockwise in the complex plane
- The DFT matrix rows rotate **clockwise** at different frequencies
- Each row de-rotates any sine waves at that frequency, giving a large bin value

DFT Calculation Example



Signal $x(n)$

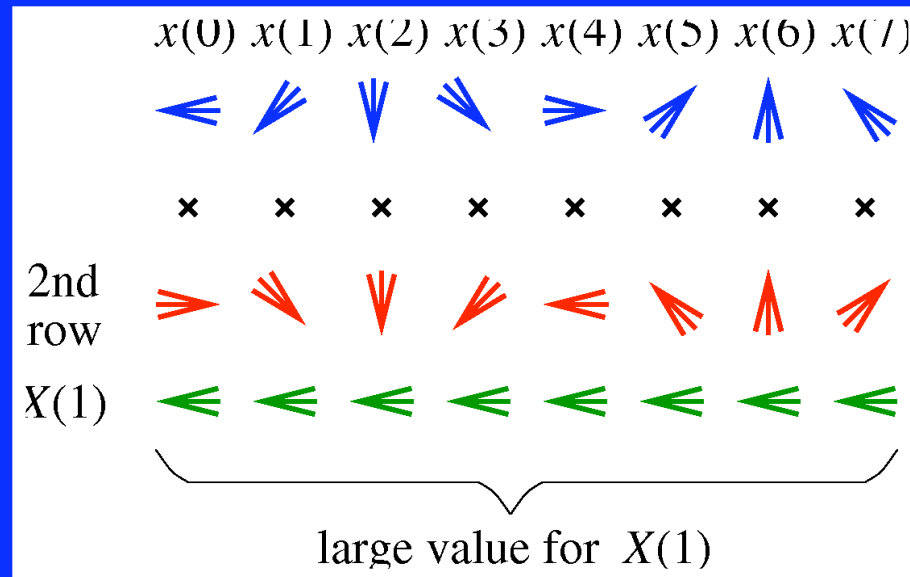
Fig9.5



DFT Calculation

Phase Offset DFT Example

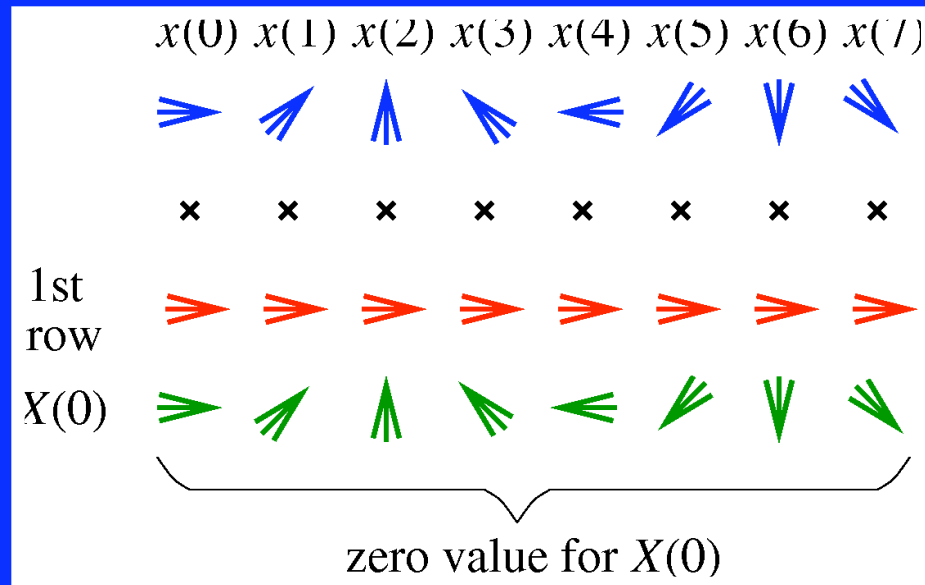
- Add 180° phase shift to input signal:



- Magnitude of $X(1)$ unchanged, but added 180° phase shift

DFT Calculation Example - Bin 0

- Evaluation of $X(0)$:



- Product terms cancel each other as they are summed to form $X(0)$

DFT Output

- For our test signal, the DFT output is:

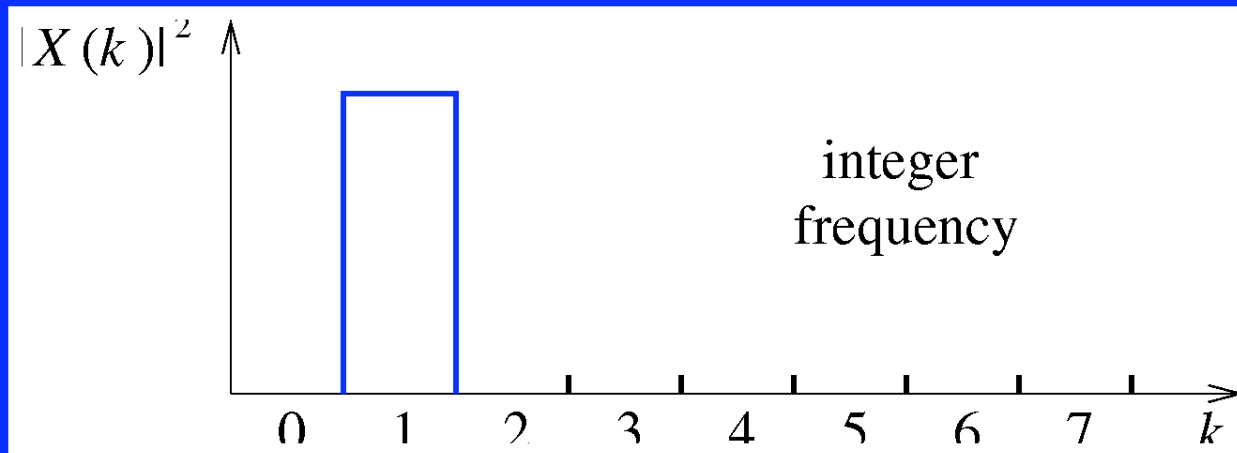


Fig
9.6a

- One non-zero bin at frequency of complex exponential

The DFT as a Filterbank

- The filterbank realisation:

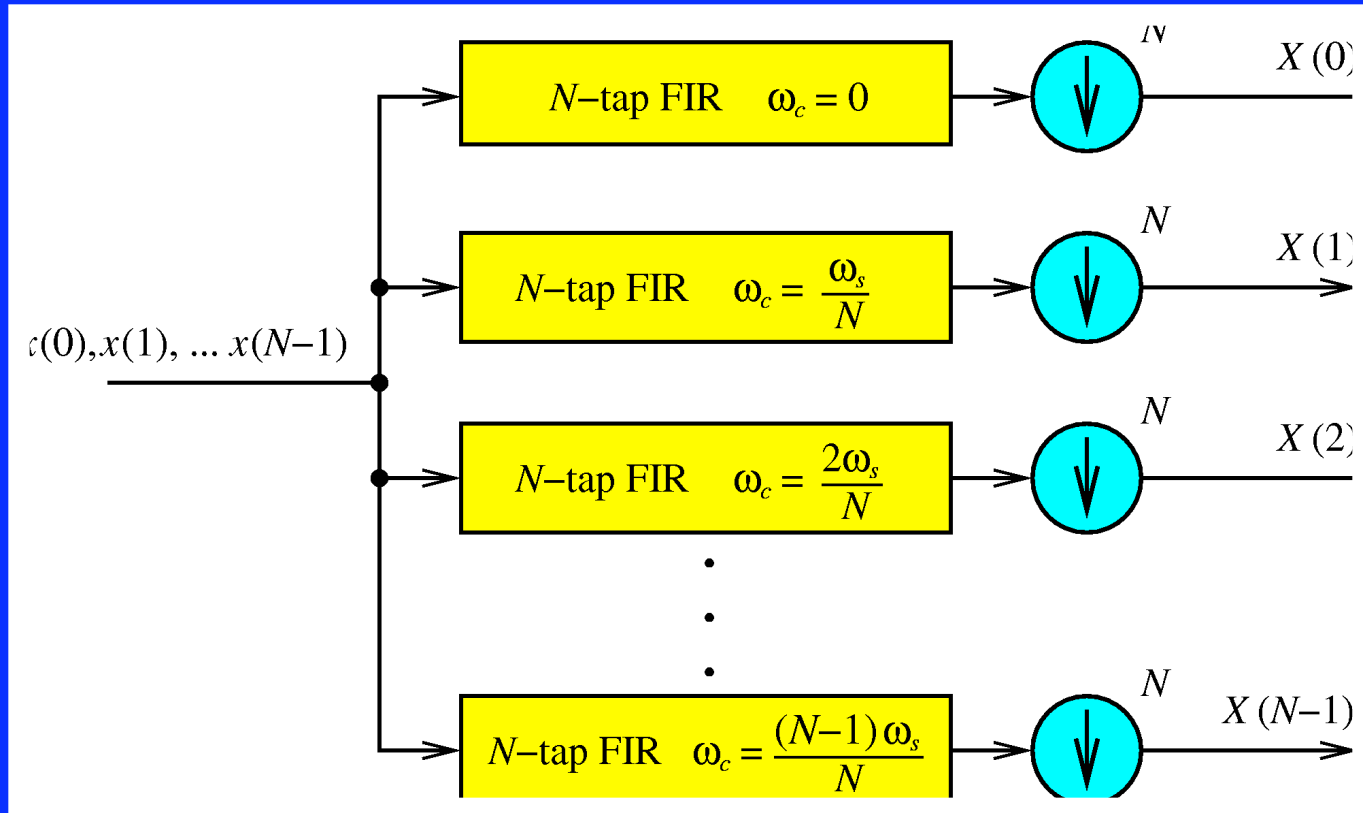


Fig
9.7

- The 8-point DFT thus consists of 8 FIR filters of length 8 taps
- The filters are low-pass or bandpass, with centre frequencies spaced by $\omega_s/8$:

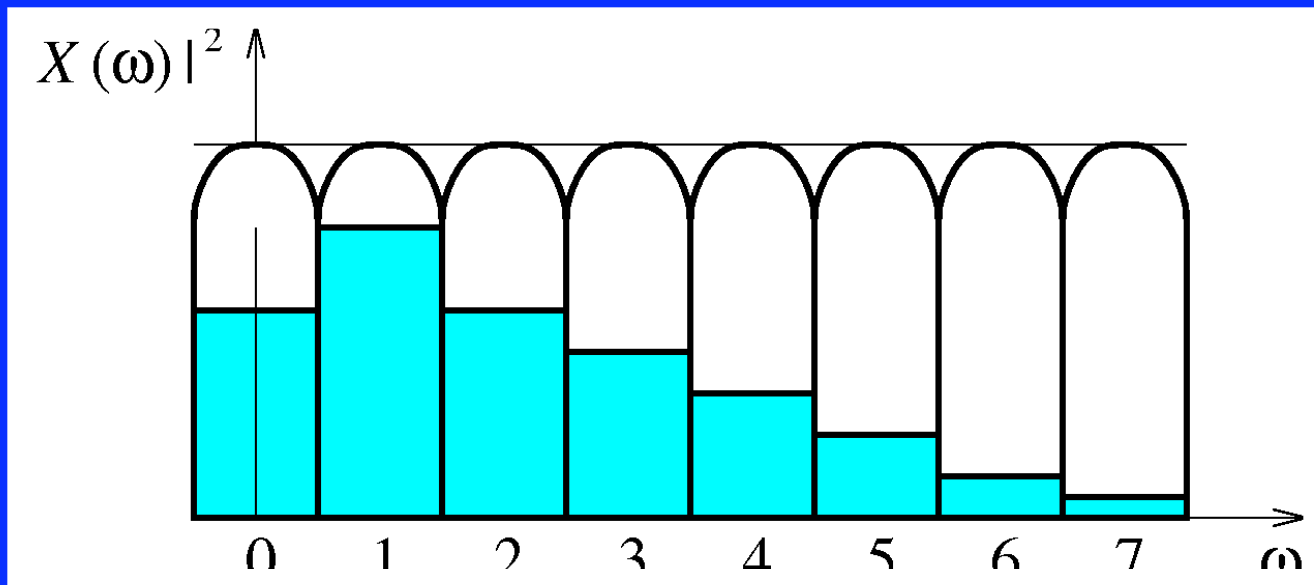
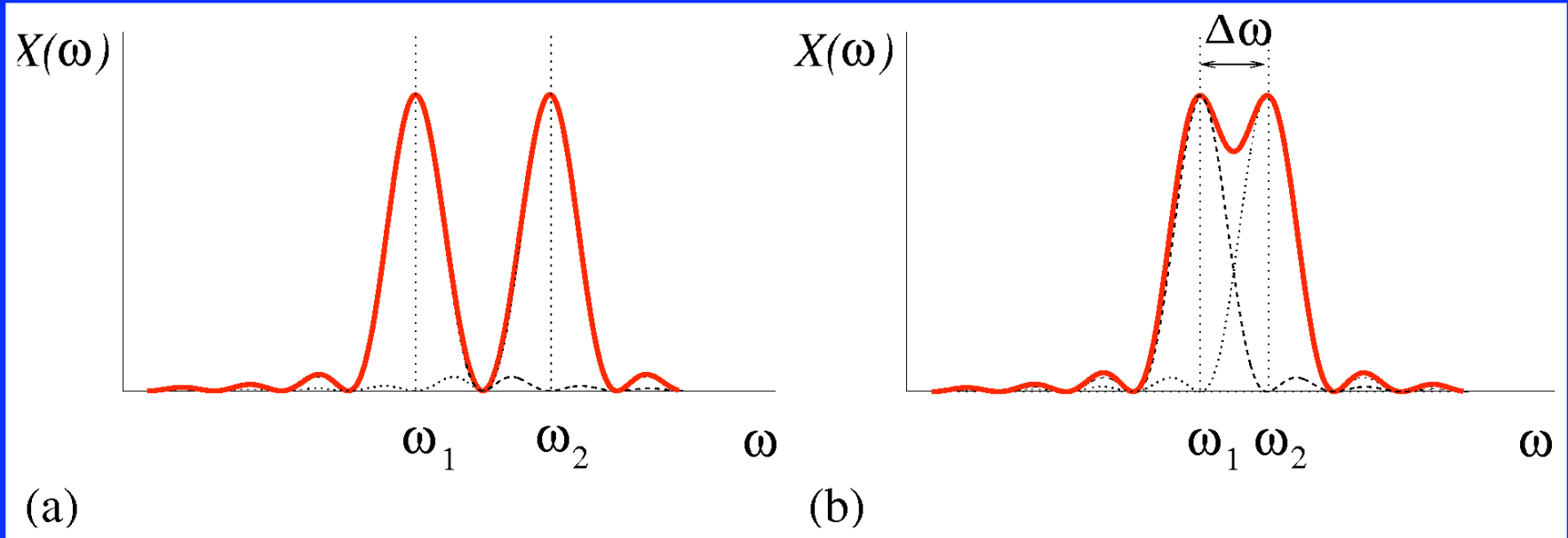


Fig
9.8

DFT Resolution

- Each DFT filter in the filterbank has a $\text{sinc}(x)$ shape in frequency
- Resolving two sine waves:
 - ▶ Assume sine waves have frequencies equal to those of two consecutive bins
 - ▶ DFT yields two peaks in the two bins
- Minimum resolution of an N-point DFT is thus $\Delta\omega = \omega_s/N = 2\pi/N\Delta t$

Visualising Resolution



(a) Two sine waves (b) Minimum resolution sine wave spacing

DFT Leakage

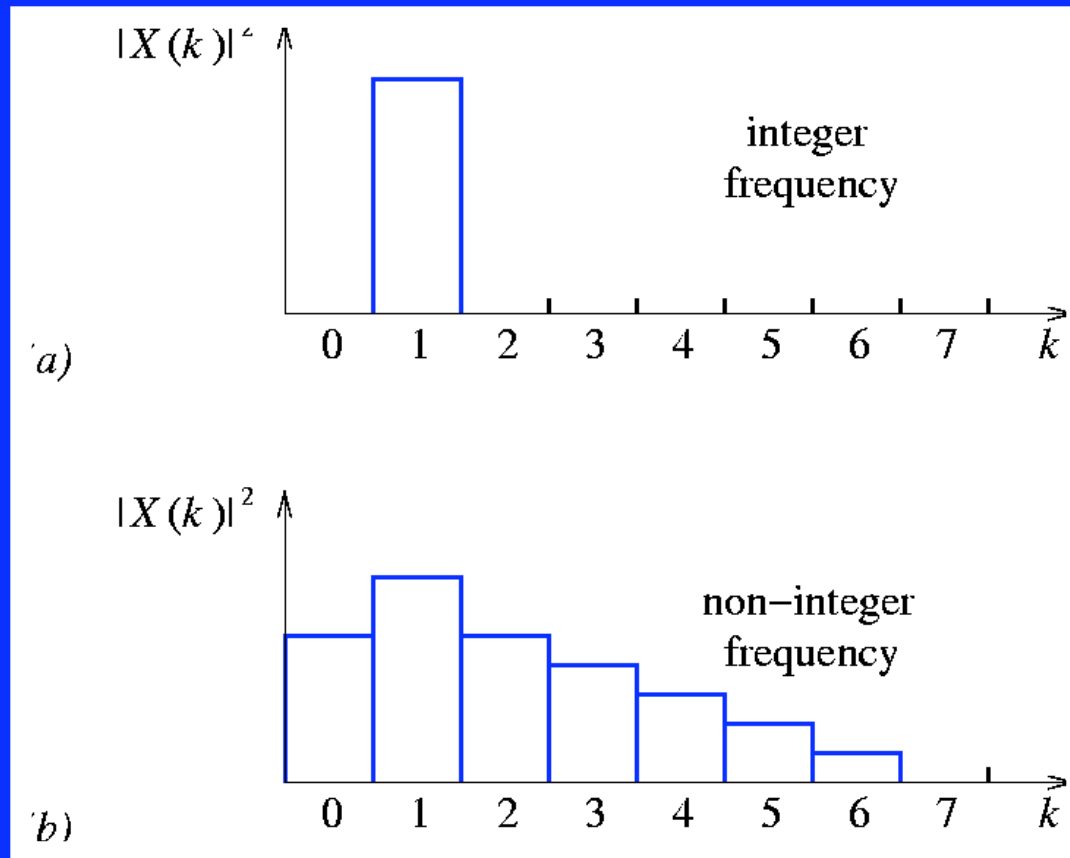


Fig
9.6

- Worst case leakage for $\omega_f = (n+0.5)\Delta\omega$

The Rectangular Window

- Two sine waves set at bin frequencies:

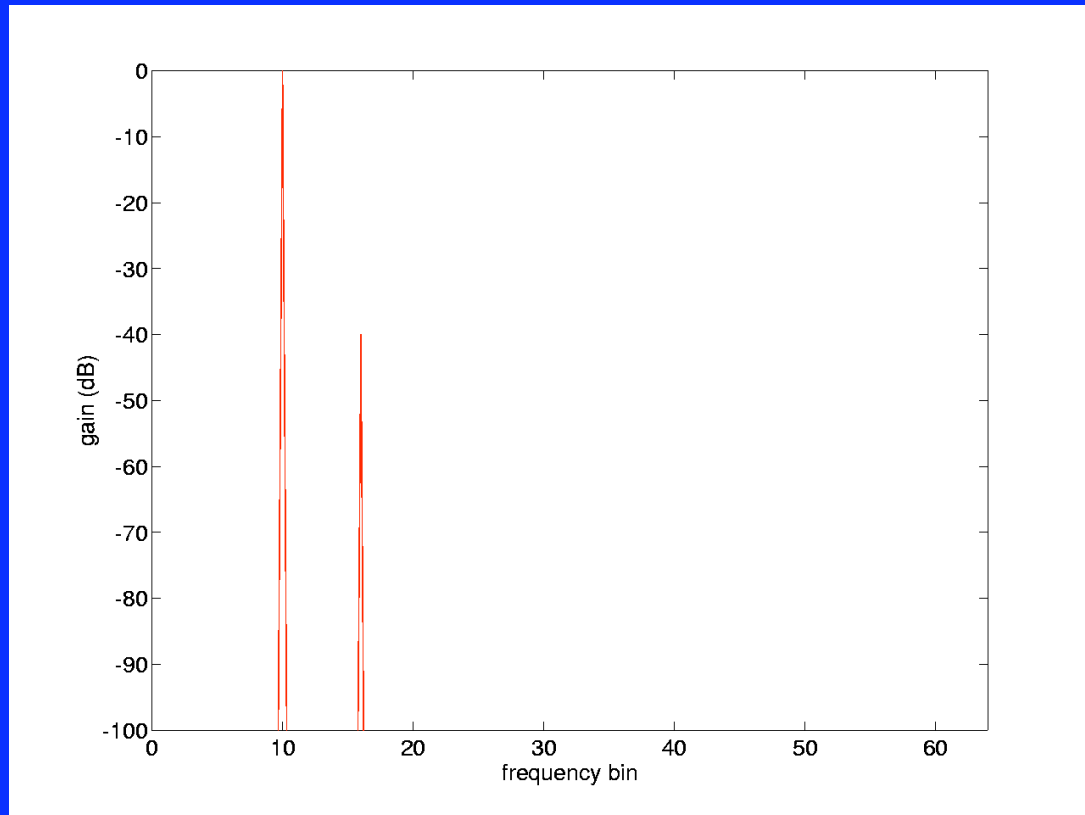


Fig
9.9

- Now set larger sine wave frequency half way between two bins:

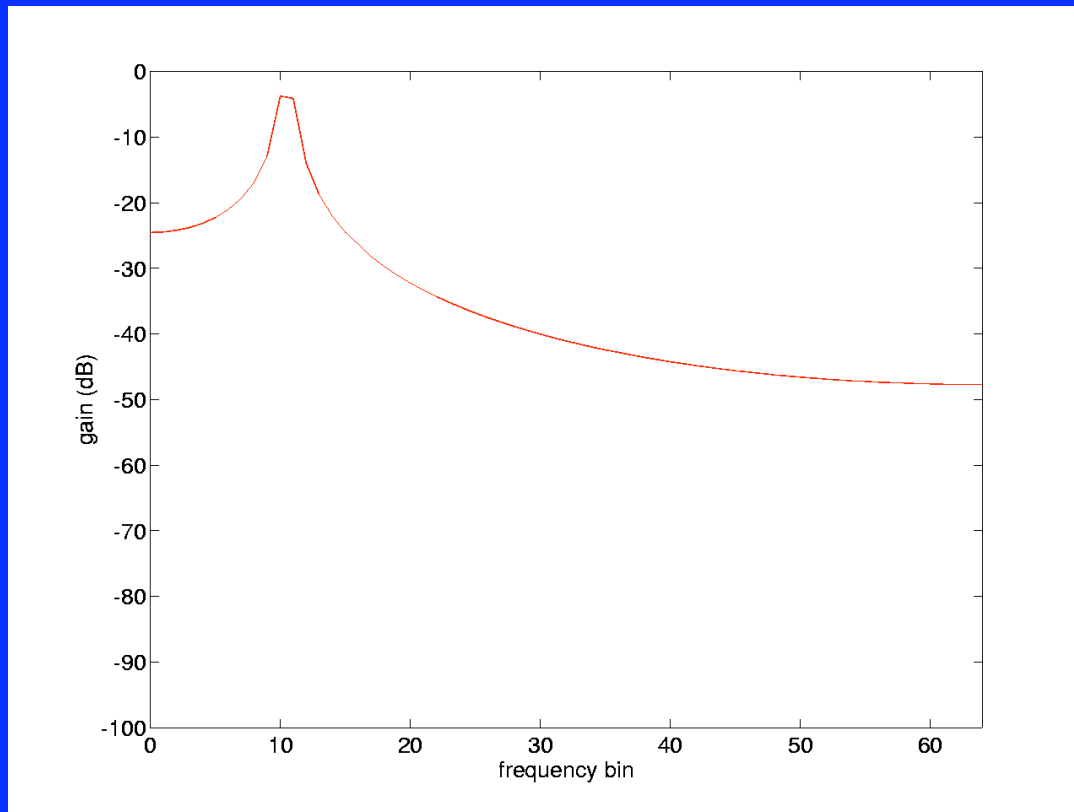


Fig
9.10

- Now we use zero padding to get 1024-point DFT and examine bins 0-200:

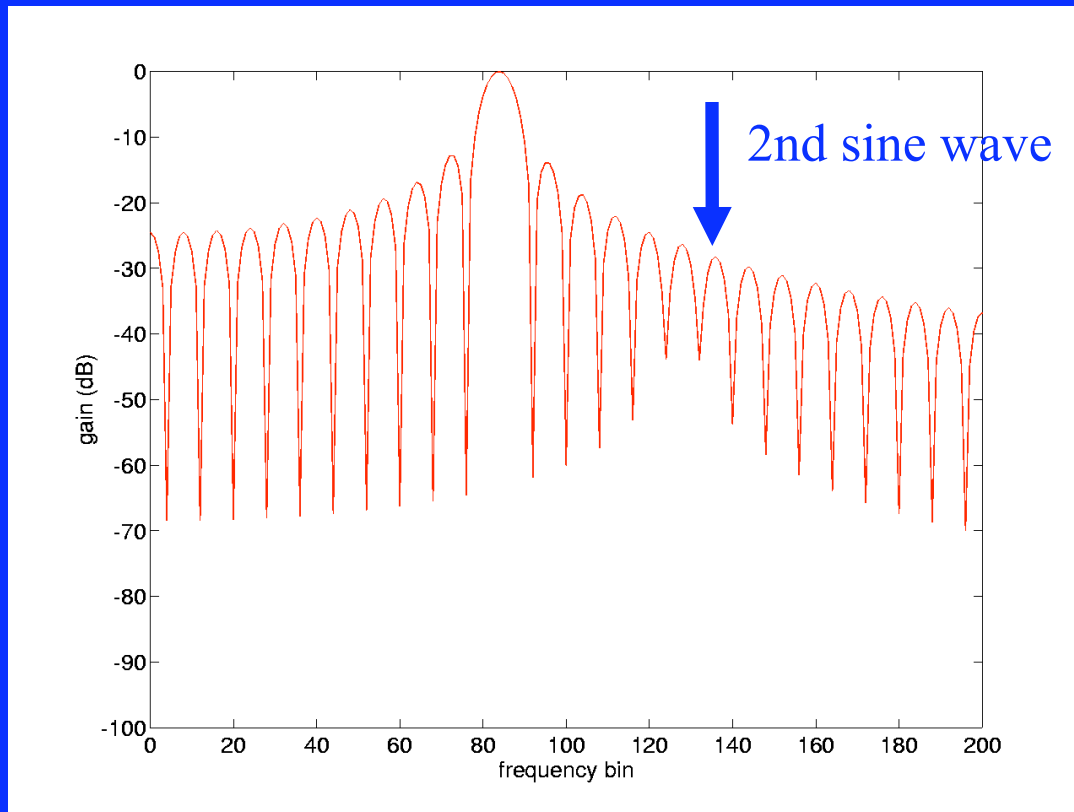


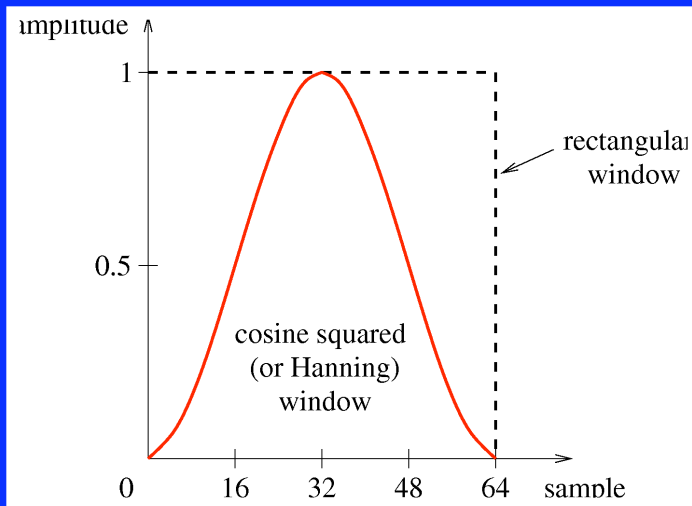
Fig
9.11b

Leakage Effects

- Sine waves lying between bins give leakage into multiple frequency bins
- Leakage caused by $\text{sinc}(x)$ frequency response of rectangular window
- In example, second sine wave 40 dB down was lost in the leakage of first sine wave

Windowing Functions

- As in FIR Filter design, multiply signal $x(n)$ by a window, before DFT operation
- Hanning window is widely used:



$$w_n = 0.5 - 0.5 \cos(2n\pi / M)$$
$$(n = 0 \dots M - 1)$$

Fig 9.12

DFT with Hanning window

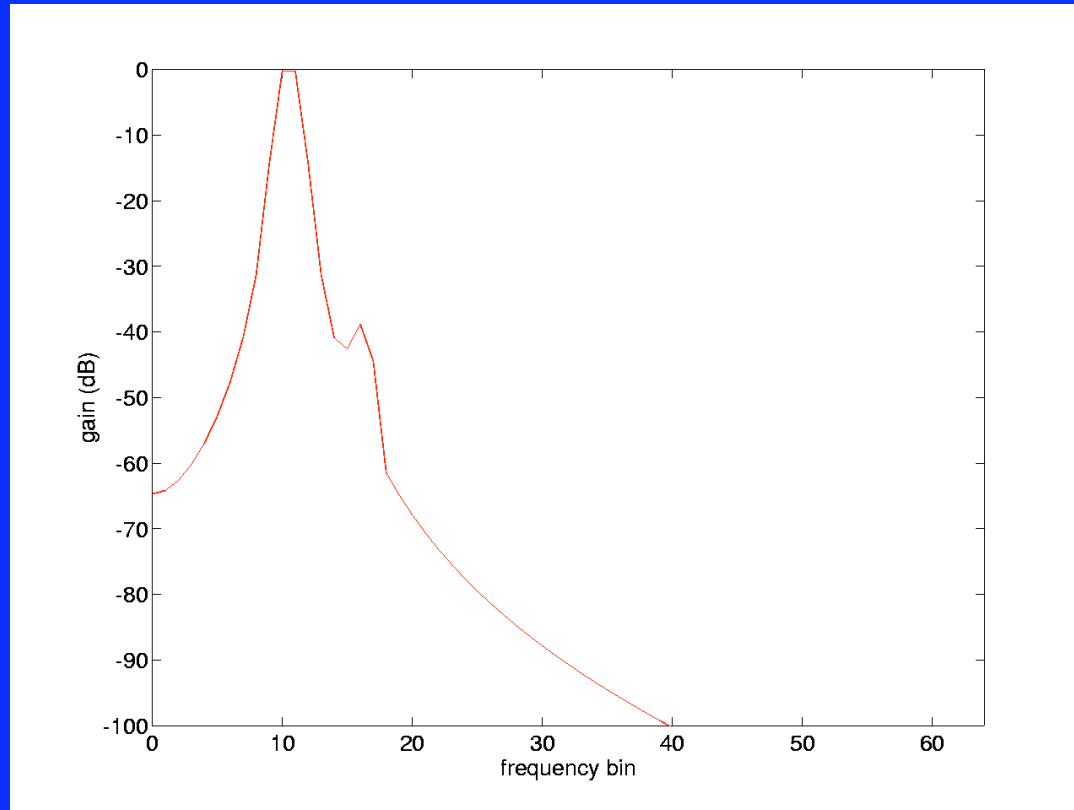


Fig
9.13a

- Both sine waves are resolved (just)
- Main lobes of each peak are wider

Hamming Window

- Can also use the Hamming window:

$$w_n = 0.54 - 0.46 \cos(2n\pi/M), \quad n = 0 \dots M - 1$$

- Hamming vs Hanning windows:
 - ▶ First sidelobe reduced from -32 dB (Hanning) to -43 dB (Hamming)
 - ▶ But decay of sidelobe levels is slower for Hamming than for Hanning

DFT with Hamming Window

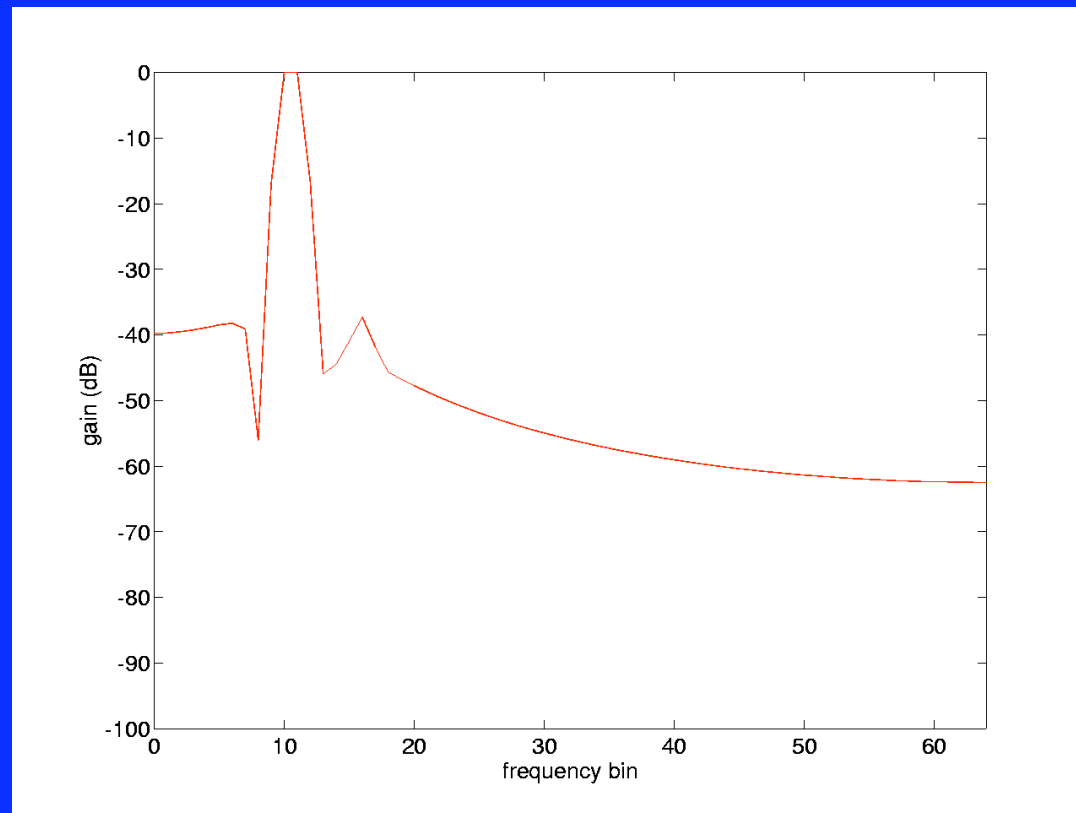


Fig
9.13b

- Second sine wave is barely resolved

Dolph-Chebyshev Window

- Window equation is:

$$w_n = \frac{N-1}{N-n-1} \sum_{k=0}^M \left(\frac{n-1}{k} \right) \left(\frac{N-n-1}{k+1} \right) \beta^{k+1}, \quad n \neq 0, N-1$$

- Where: $M=n-1$ ($n \leq N/2$), $M=N-n-2$ ($n > N/2$)
- w_n has value 1 for $n=0, N-1$
- β is defined as: $\beta = \cosh(\cosh^{-1}(10^{\alpha}) / N)$

Dolph-Chebyshev Windows

- These windows provide constant sidelobe attenuation
- The value α is the log of sidelobe amplitude level, eg $-2 \rightarrow -40$ dB
- Main lobe has the minimum width possible for the given leakage level

DFT with Dolph-Chebyshev Window ($\alpha=3$)

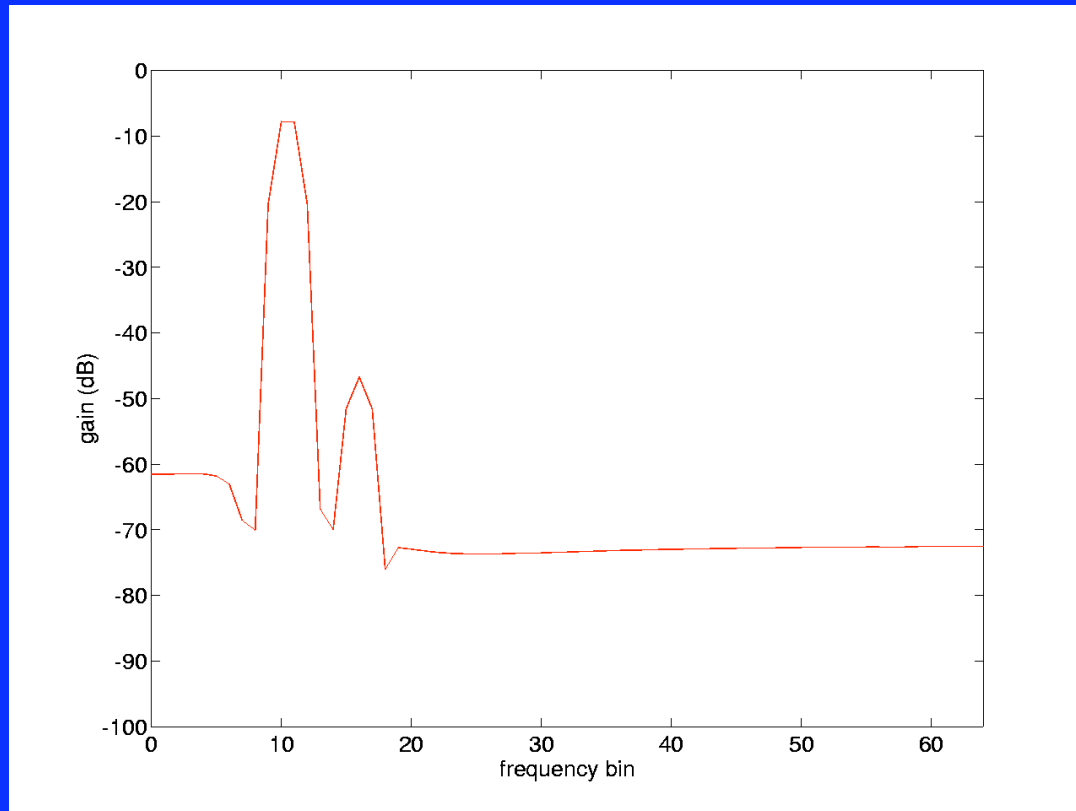


Fig
9.14a

- Sine wave peaks are clearer but main lobes are now wider too

Window Comparisons (Table 9.1)

Window	Main lobe width (Hz)	Sidelobe level	Roll-off rate
Rectangular	$\frac{0.89}{N\Delta t}$	-13 dB	6dB/dec
Hanning	$\frac{1.4}{N\Delta t}$	-32 dB	18dB/dec
Hamming	$\frac{1.3}{N\Delta t}$	-43 dB	6dB/dec
Dolph-Chebyshev	$\frac{1.44}{N\Delta t}$	-60 dB	0dB/dec

Summary

- Fourier transform to discrete Fourier transform
- Properties of the DFT
- DFT evaluation