

# Fast Fourier Transforms (FFTs) and Windowing

TIPL 4302

TI Precision Labs – ADCs

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Presented by Peggy Liska

# Definition for time to frequency transformations

$$F(\omega) = \frac{1}{2\pi} \int_{-\infty}^{+\infty} f[t] \cdot e^{-i\omega t} dt$$

## Fourier Transform (continuous time)

Where

**F[ $\omega$ ]** = frequency domain continuous function

**f[**t**]** = time domain continuous function

**t** = time

**$\omega$**  = angular frequency

## Fast Fourier Transform (FFT)

Used for digitized waveforms

Where

**F[**k**]** = sample in frequency

**f[**n**]** = sample in time

**n** = time index

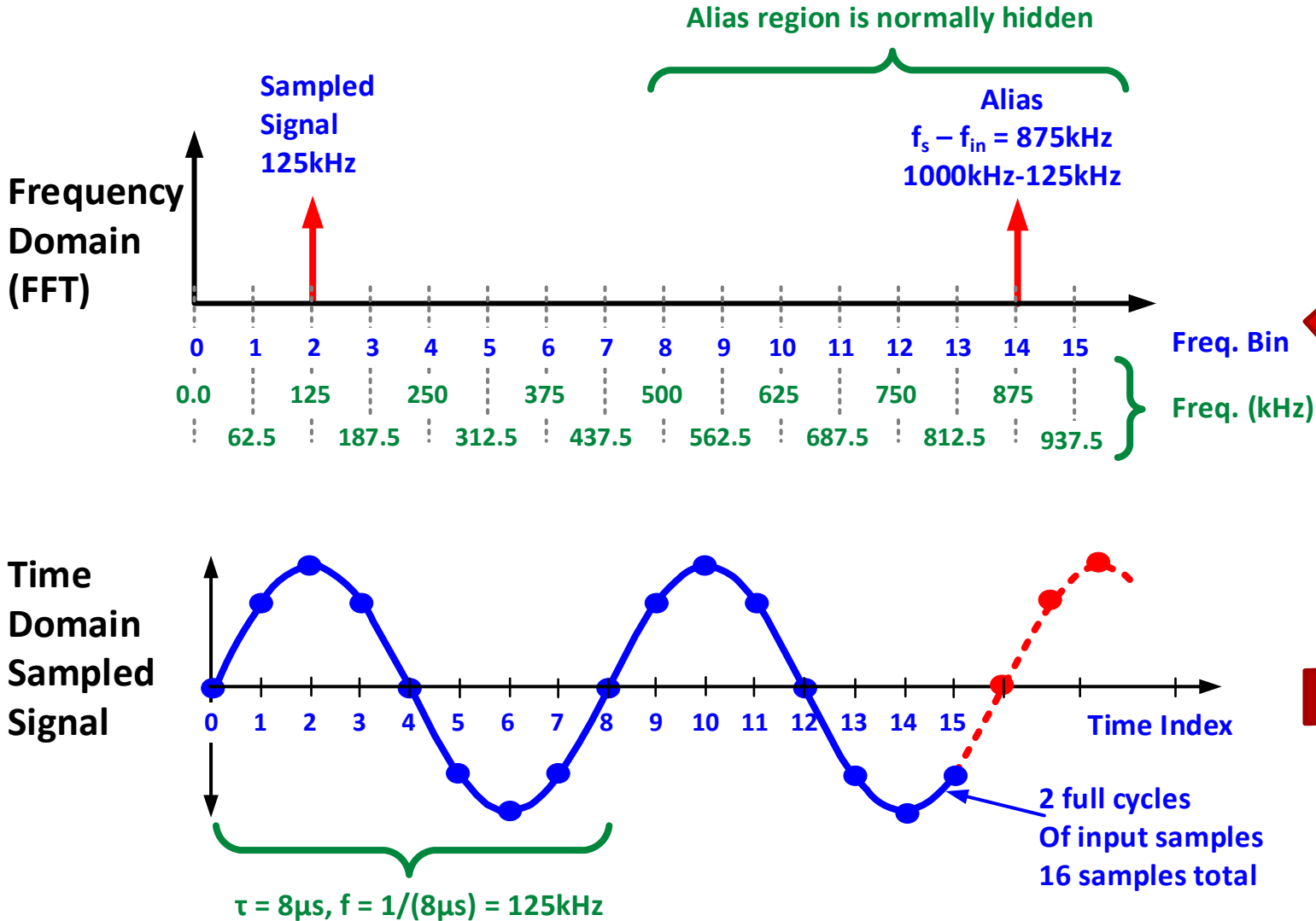
**k** = frequency index

**N** = number of samples

N must be a power of 2 (e.g. 256, 512, 1024...)

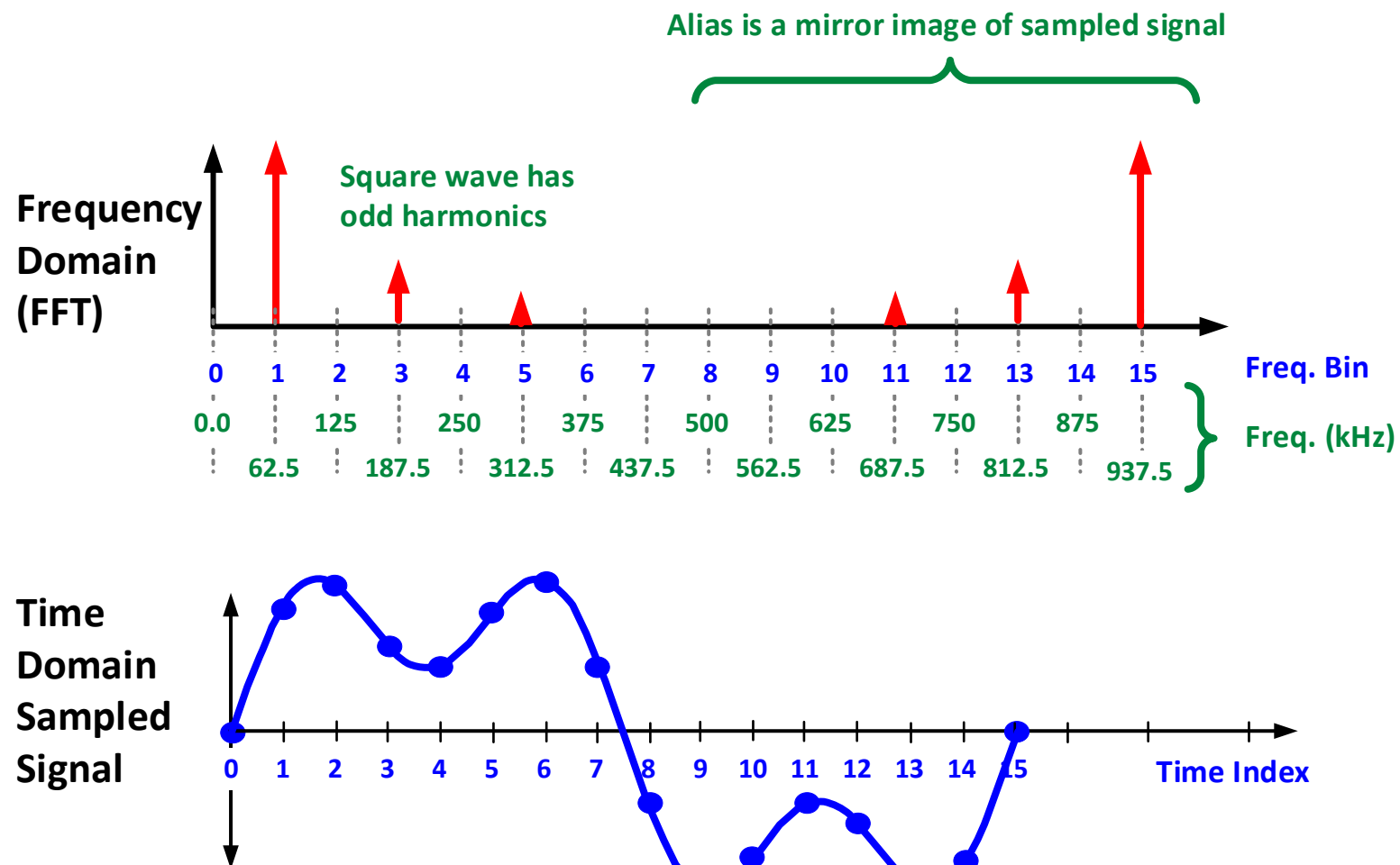
$$F[k] = \sum_{n=0}^{N-1} f[n] \cdot e^{-i2\pi k \frac{n}{N}}$$

# FFT Basics: Alias and Frequency Resolution



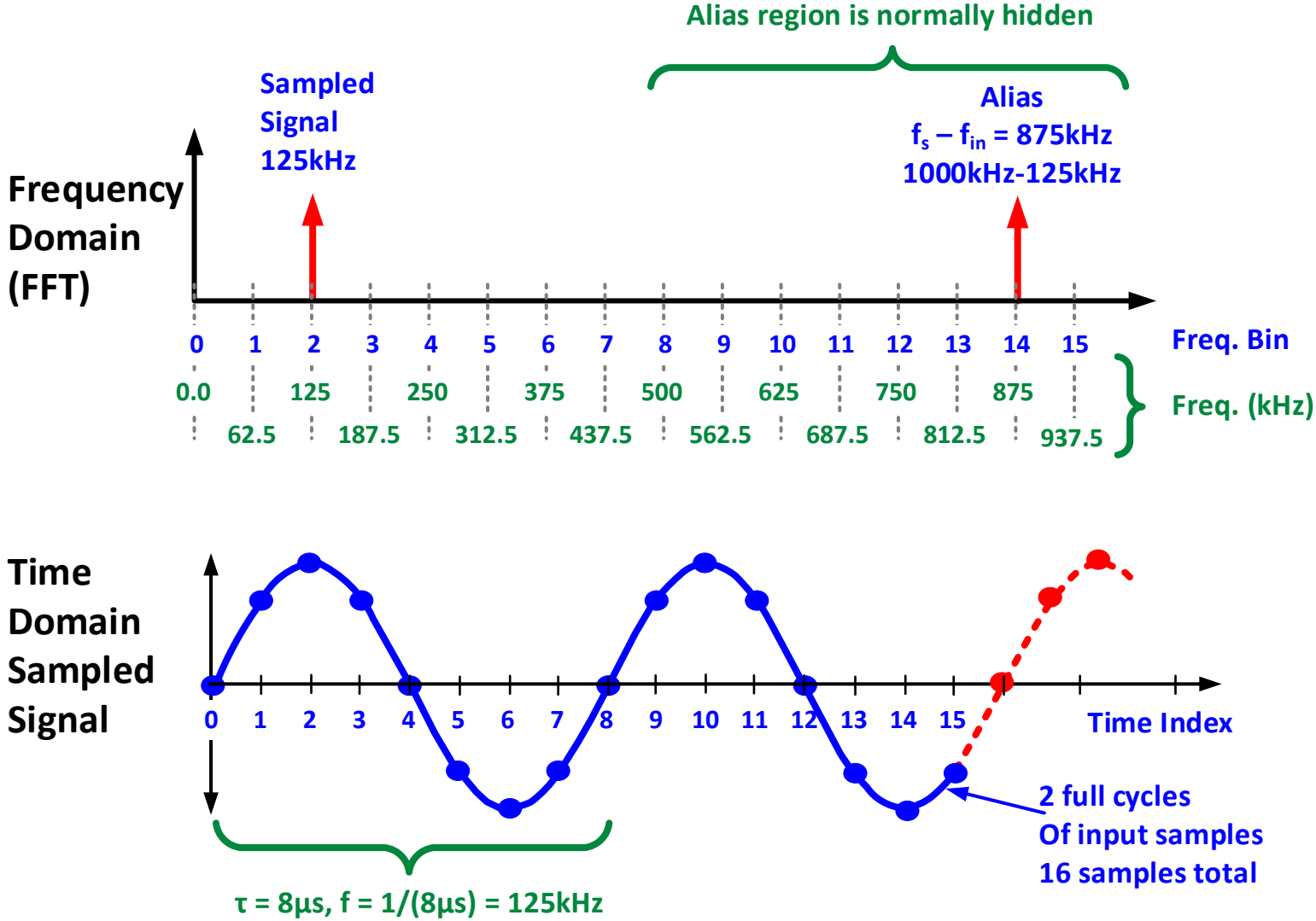
1. FFT assumes time domain continues forever
2. Number of points in time domain equals number of points in FFT
3. The alias region is normally hidden. Mirror image about  $f_s / 2$  "aliasing"
4. Frequency Resolution =  $\Delta f = f_s / N$   
 $\Delta f = f_s / N = 1\text{MHz} / 16 = 62\text{kHz}$

# Alias is a Mirror Image of Sampled Signal



- Example of a “square wave”
- Square wave contains odd harmonics e.g. 3, 5, 7 ...
- Notice the symmetry around 500kHz

# FFT Example Calculation

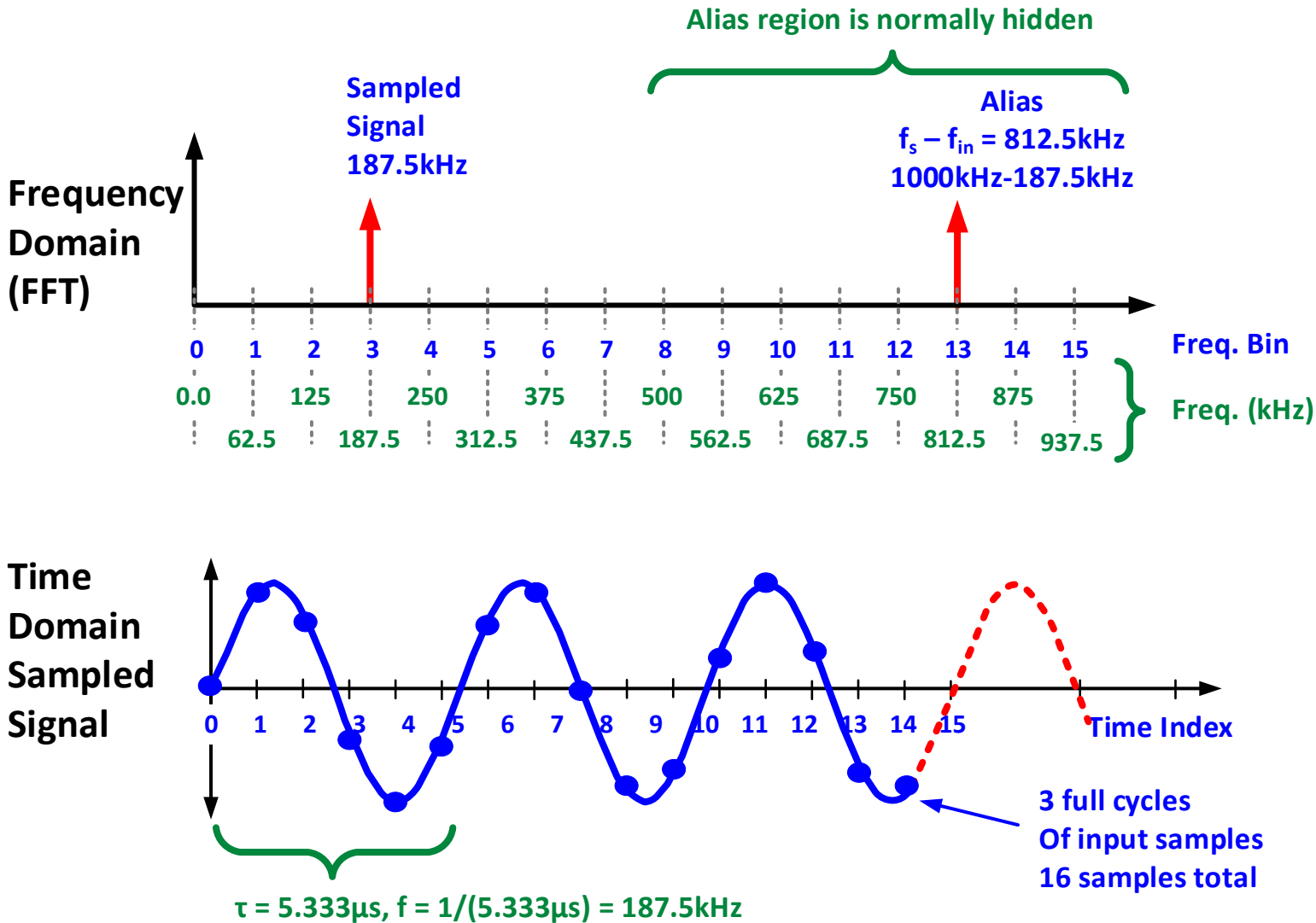


## Example FFT

$f_s = 1\text{MHz}$   
 $N_{\text{samp}} = 16$   
 $\Delta f = \frac{f_s}{N_{\text{samp}}} = \frac{1\text{MHz}}{16} = 62.5\text{kHz}$   
 $\Delta t = \frac{1}{f_s} = \frac{1}{1\text{MHz}} = 1\mu\text{s}$   
 $f_{in} = 125\text{kHz}$   
 $k_f = \frac{f_{in}}{\Delta f} = \frac{125\text{kHz}}{62.5\text{kHz}} = 2.0$

Sampling Rate  
 Number of Samples  
 Frequency Resolution  
 Sampling time  
 Input signal  
 Frequency Bin  
 Note:  $f_{in}$  is an exact integer multiple of  $\Delta f$

# FFT – Different Input Frequency

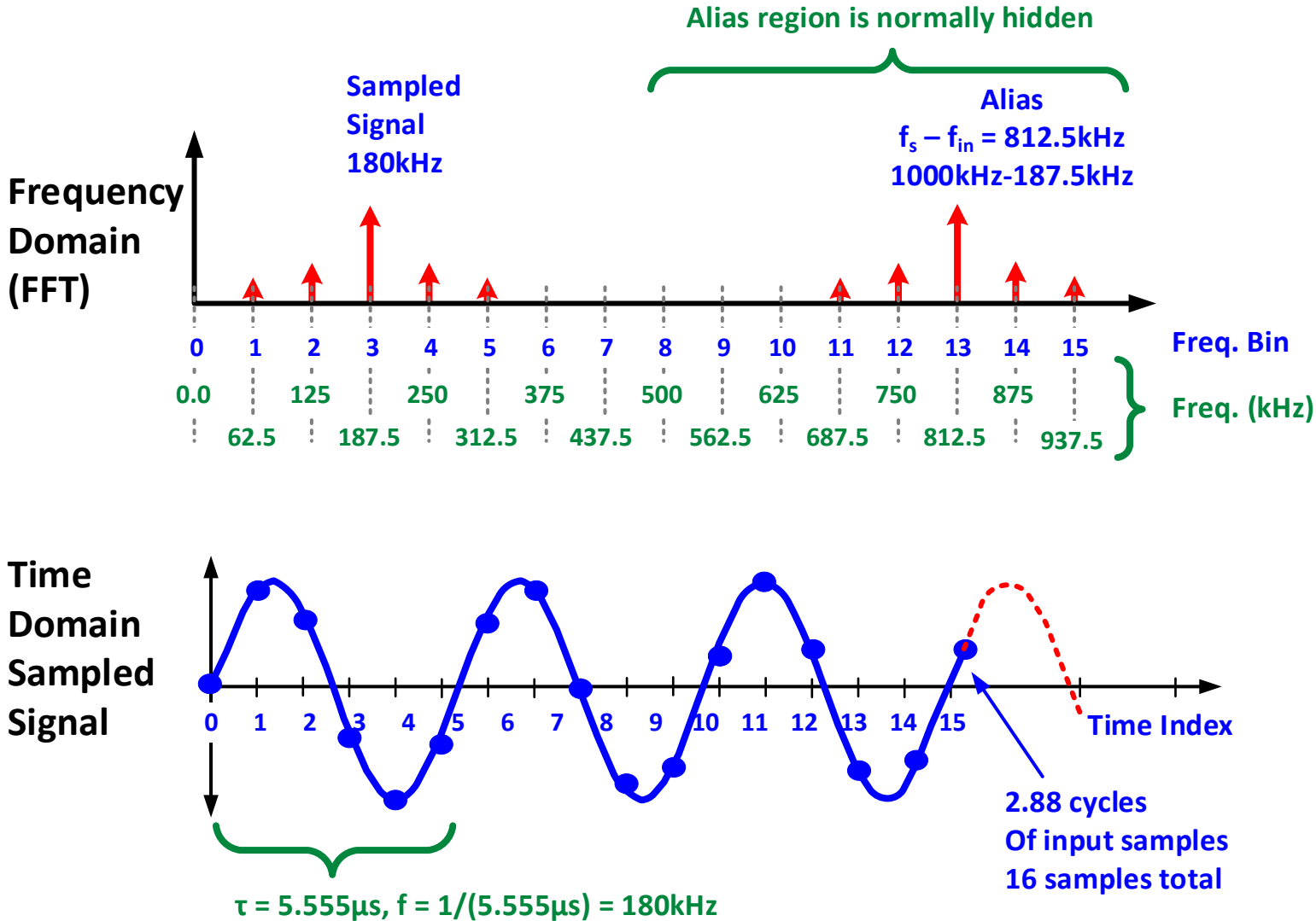


### Example FFT

$f_s = 1\text{Mpsps}$   
 $N_{\text{samp}} = 16$   
 $\Delta f = \frac{f_s}{N_{\text{samp}}} = \frac{1\text{Mpsps}}{16} = 62.5\text{ksps}$   
 $\Delta t = \frac{1}{f_s} = \frac{1}{1\text{Mpsps}} = 1\mu\text{s}$   
 $f_{in} = 187.5\text{kHz}$   
 $k_f = \frac{f_{in}}{\Delta f} = \frac{187.5\text{kHz}}{62.5\text{ksps}} = 3.0$

Sampling Rate  
 Number of Samples  
 Frequency Resolution  
 Sampling time  
 Input signal  
 Frequency Bin  
 Note:  $f_{in}$  is an exact integer multiple of  $\Delta f$

# FFT – Spectral Leakage



## Example FFT

$f_s = 1\text{Msps}$

$N_{samp} = 16$

$\Delta f = \frac{f_s}{N_{samp}} = \frac{1\text{Msps}}{16} = 62.5\text{ksps}$

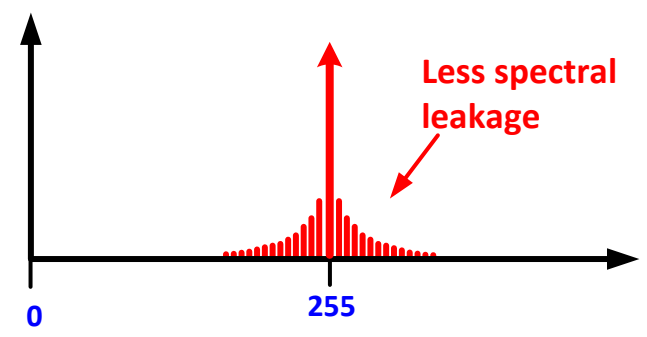
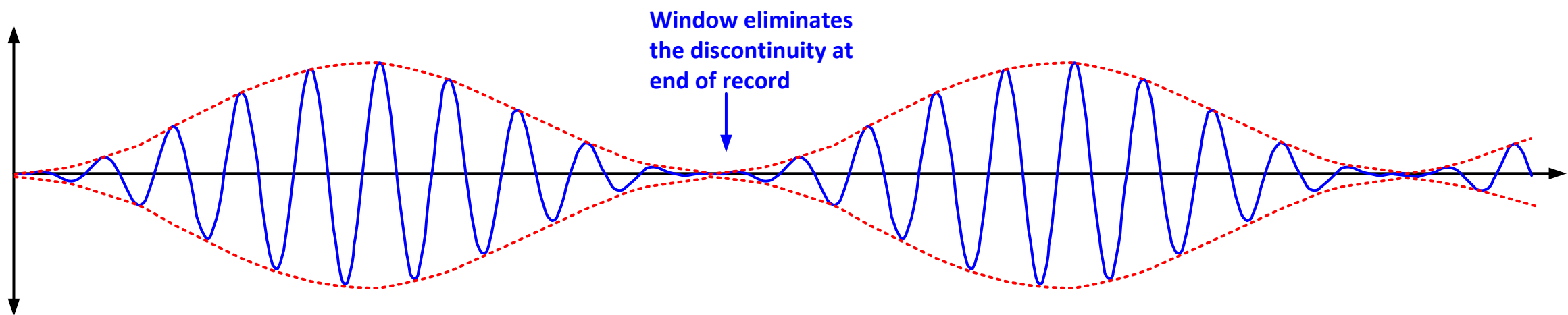
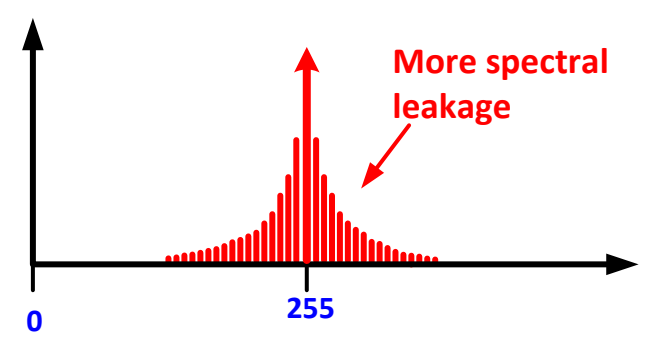
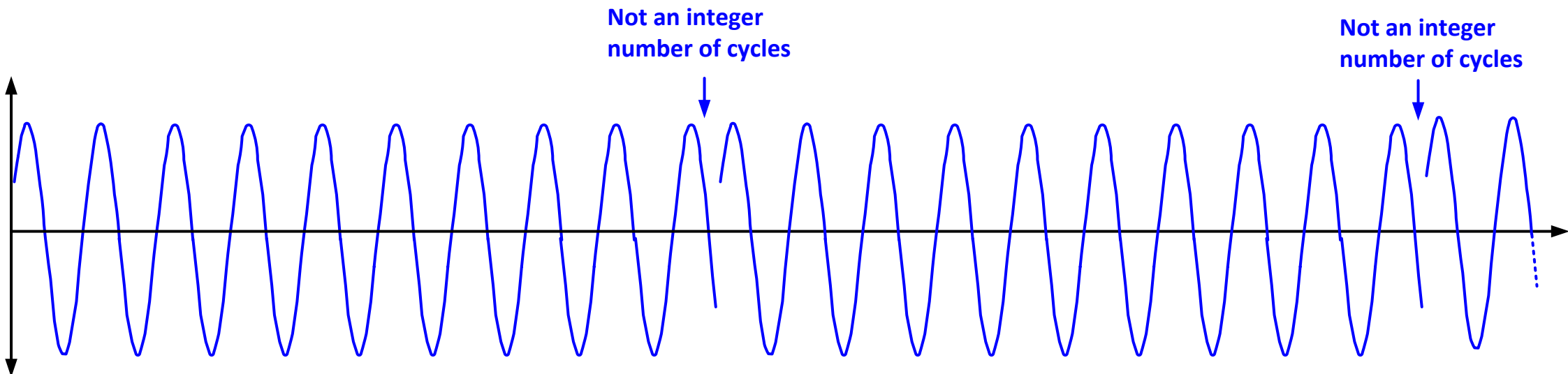
$\Delta t = \frac{1}{f_s} = \frac{1}{1\text{Msps}} = 1\mu\text{s}$

$f_{in} = 180\text{kHz}$

$k_f = \frac{f_{in}}{\Delta f} = \frac{180\text{kHz}}{62.5\text{ksps}} = 2.88$

- Sampling Rate
- Number of Samples
- Frequency Resolution
- Sampling time
- Input signal
- Frequency Bin
- Note:  $f_{in}$  is NOT an exact integer multiple of  $\Delta f$

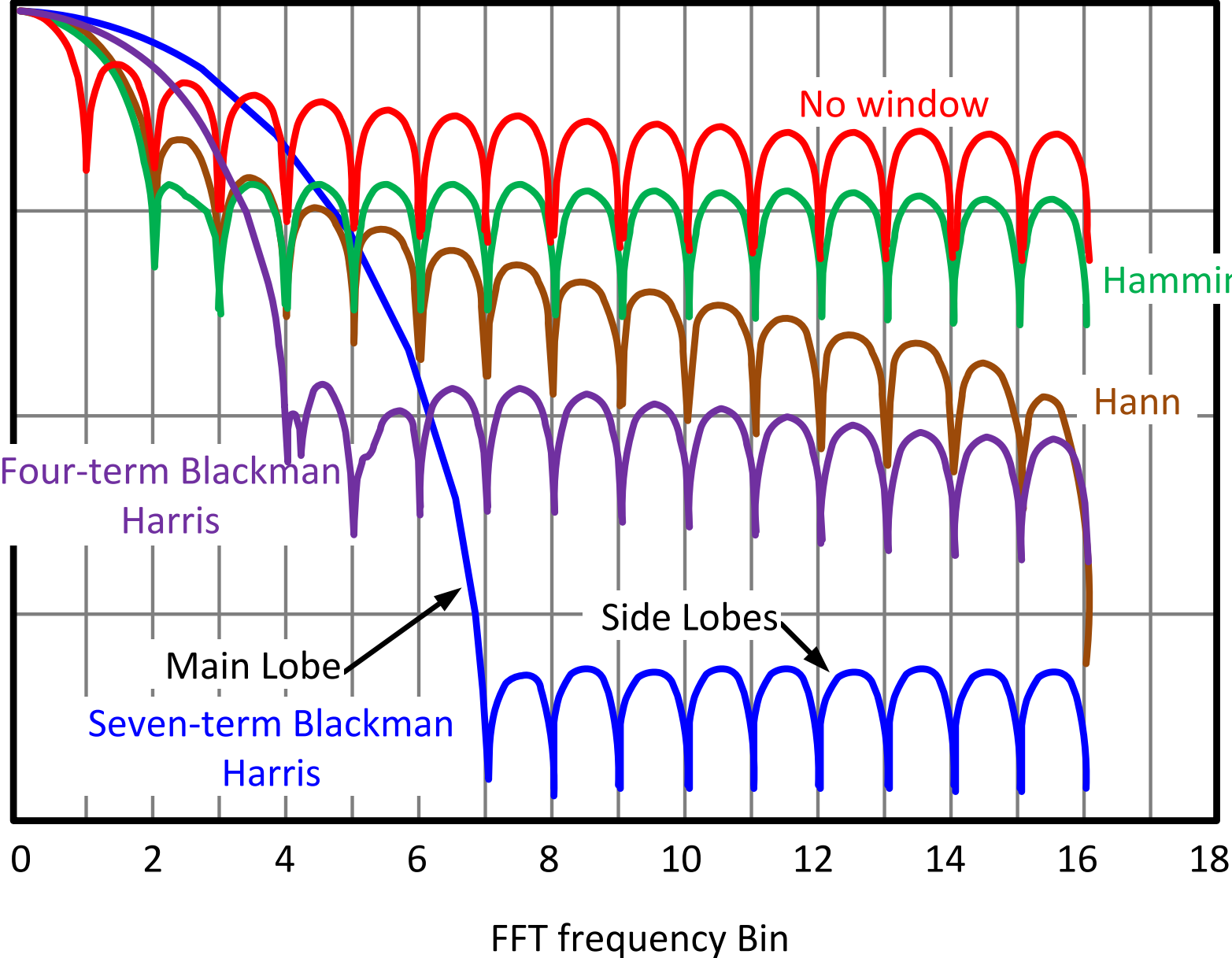
# Window: Eliminates discontinuity in sampled waves





# Comparing Frequency Response of Different Windows

Frequency Response of popular window functions



- Ideally we would like a very narrow main lobe and very deep attenuation in side lobes.
- For ADC characterization 7 term Blackman Harris is most often used.

# Different Windows for Different Applications

Signal Content	Window
ADC characterization	Blackman Harris
Sine wave or combination of waves	Hann
Sine Wave (amplitude accuracy is important)	Flat Top
Narrowband random signal (vibration data)	Hann
Broadband random (white noise)	Uniform
Closely spaced sine waves	Uniform, Hamming
Excitation signals (hammer blow)	Force
Response signals	Exponential
Unknown content	Hann
Two tones with frequencies close but amplitudes very different	Kaiser-Bessel
Two tones with frequencies close and almost equal amplitudes	Uniform
Accuracy single tone amplitude measurements	Flat Top

# Window Processing Errors

Parameters used to characterize frequency response of windowing functions						
Window	Highest side lobe level (dB)	Processing loss (dB)	Scalloping loss (dB)	Worst-case processing loss (dB)	6-dB bandwidth (bins)	Half main lobe width (bins)
No window	-13	0.00	3.92	3.92	1.21	1
Hann	-32	1.76	1.33	3.09	2.00	2
Hamming	-43	1.34	1.76	3.10	1.82	2
Four-term Blackmon Harris	-92	3.00	0.83	3.83	2.72	4
Seven-term Blackmon Harris	-163	4.20	0.46	4.66	3.52	7

**Thanks for your time!**  
**Please try the quiz.**



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# Quiz: Fast Fourier Transforms (FFTs) and Windowing

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# Quiz: Fast Fourier Transforms (FFTs) and Windowing

1. A time domain signal has 1024 points in it. How many points will be in the FFT?
  - a) 1024.
  - b) 2048.
  - c) This depends on the type of FFT used.
  
2. The sampling rate of a particular converter is 1Msps. The FFT will contain data that extends to what frequency.
  - a) 1MHz. However, the data from 500kHz to 1MHz is redundant and is normally ignored.
  - b) 2MHz. However, the data from 1MHz to 2MHz is an alias.
  - c) This depends on the number of points of the FFT.

# Quiz: Fast Fourier Transforms (FFTs) and Windowing

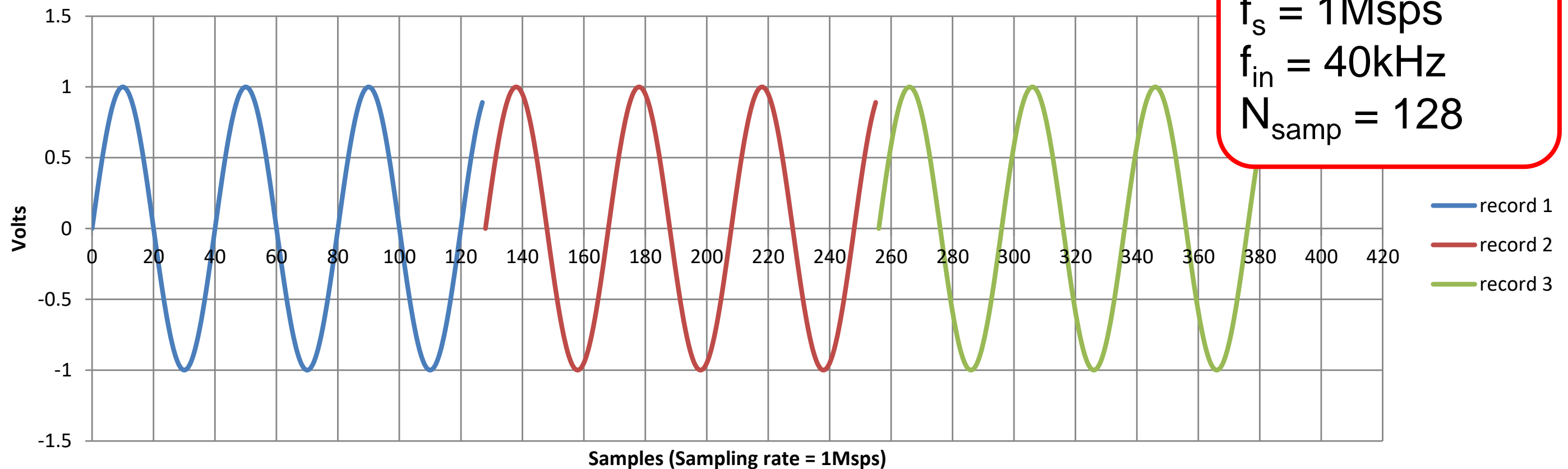
3. What is the purpose of the windowing function?
  - a) The window function minimizes spectral leakage.
  - b) The window function eliminates the discontinuity between records by shaping the time domain signal.
  - c) The window function acts as a band stop filter to eliminate harmonic distortion.
  - d) The window function is used to convert time domain signals to frequency domain signals.
  - e) Both a and b are correct
  - f) Both c and d are correct
  
4. What type of window is commonly used for ADC characterization?
  - a) Hamming.
  - b) Hann.
  - c) The 4 term Blackman Harris.
  - d) The 7 term Blackman Harris.



# Quiz: Fast Fourier Transforms (FFTs) and Windowing

5. Convert the time domain signal below to its frequency domain equivalent.
- a) What is the frequency resolution?
  - b) What bins does the frequency domain signal fall in?
  - c) Does this FFT have spectral leakage?
  - d) Draw the FFT.

**Digitized Signal vs. Time**



# Solutions

# Quiz: Fast Fourier Transforms (FFTs) and Windowing

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  - a) **1024.**
  - b) 2048.
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2. The sampling rate of a particular converter is 1Msps. The FFT will contain data that extends to what frequency.
  - a) **1MHz. However, the data from 500kHz to 1MHz is redundant and is normally ignored.**
  - b) 2MHz. However, the data from 1MHz to 2MHz is an alias.
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# Quiz: Fast Fourier Transforms (FFTs) and Windowing

3. What is the purpose of the windowing function?
- a) The window function minimizes spectral leakage.
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  - c) The window function acts as a band stop filter to eliminate harmonic distortion.
  - d) The window function is used to convert time domain signals to frequency domain signals.
  - e) Both a and b are correct**
  - f) Both c and d are correct
4. What type of window is commonly used for ADC characterization?
- a) Hamming.
  - b) Hann.
  - c) The 4 term Blackman Harris.
  - d) The 7 term Blackman Harris.**

# Quiz: Fast Fourier Transforms (FFTs) and Windowing

5. Convert the time domain signal below to its frequency domain equivalent.
- a) What is the frequency resolution?  $\Delta f = f_s / N_{\text{samp}} = 1\text{MHz} / 128 = 7.8125\text{kHz}$
  - b) What bins does the frequency domain signal fall in?  $k_f = f_{\text{in}} / \Delta f = 40\text{kHz} / 7.8125\text{kHz} = 5.12$
  - c) Does this FFT have spectral leakage? **Yes. You can clearly see the discontinuity at the end of each record.**
  - d) Draw the FFT.

