

# Spectral Analysis

## Rationale

- \* Physical insight
- \* Orthogonality (no crossproducts)
- \* Pattern recognition
- \* Algebraic (closed form) solutions, as with many transform based methods
- \* Performance, Standards

## Frequency domain presentation

*Depends on signal class*

- \* Transient
- \* Periodic
- \* Random

All computations via basic FFT

For a signal

$$x(i\Delta t) \quad i=0,1,\dots,N$$

We have computed the FFT

$$X(k\Delta f) = \sum_{i=0}^{N-1} x(i) \exp(-j \frac{2\pi}{N} ik) \quad k=0,1,\dots,N-1$$

Frequency scale

$$\Delta f = 1/(N\Delta t)$$

$$f(k) = k\Delta f \quad k=0,1,\dots,N-1$$

## Transients:

The DFT approximates samples of the continuous FT.

For EU

$$X_{EU}(k\Delta f) = \Delta T X(k\Delta f) \quad [V - \text{sec}]$$

## Periodic signals:

$$X_{DFS}(f_k) = \frac{1}{N} X(k) \quad [V]$$

This is a 2 sided representation The computation equals that of the DFT except for the factor of N. The results are directly in [Volts] For a one sided representation

$$X_{DFS}(f_k) = \frac{1}{N/2} X(k) \quad [V]$$

$$\text{For } k = 1 \dots (N/2 - 1)$$

$$X_{DFS}(f_k) = \frac{1}{N} X(k) \quad [V]$$

$$\text{For } k = 0, k = N/2$$

Assume that  $p$  integer periods are spanned by the signal length  $N\Delta t$ . Denoting the number of samples in the period by  $M$

$$T_p = M\Delta t$$

with  $T_p$  the actual period of the physical signal. The total signal length

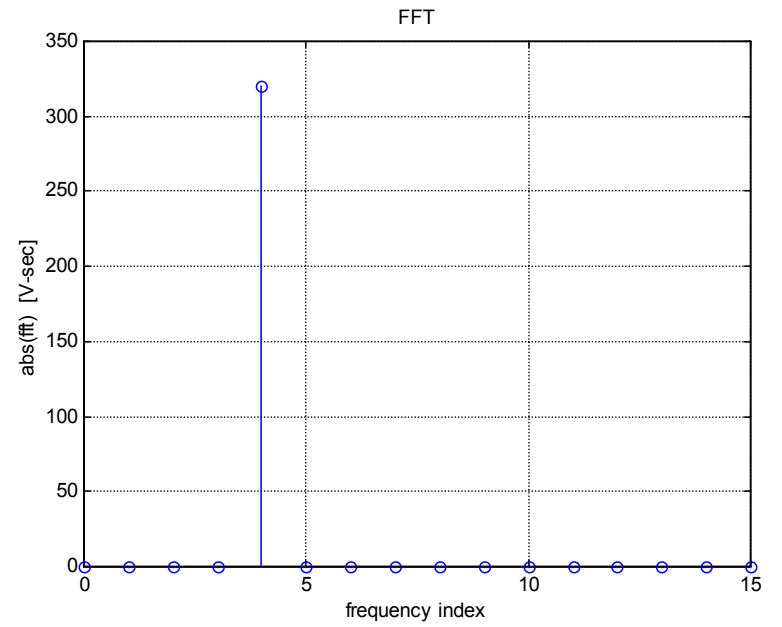
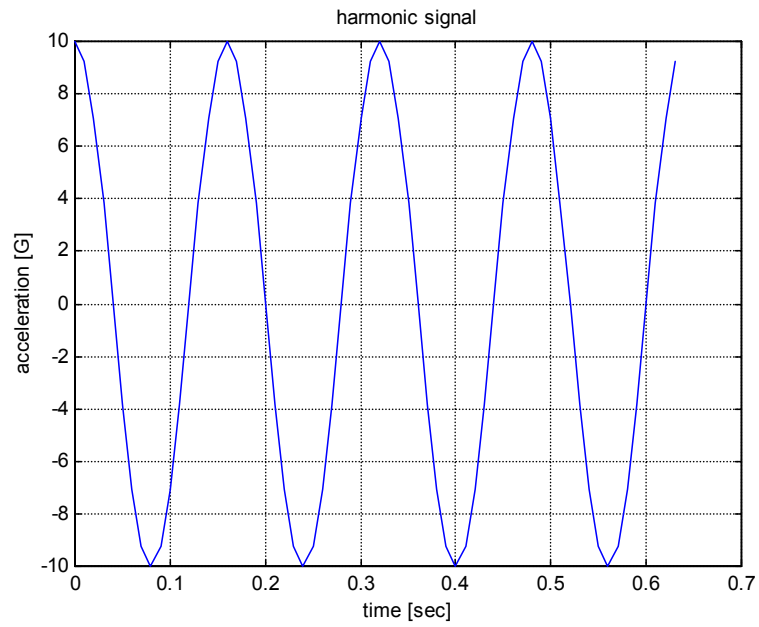
$$N\Delta t = pM\Delta t$$

and the location of  $f_p$  on the frequency scale is

$$k\Delta f = f_p = 1/(M/\Delta t)$$

$$k = 1/(M \Delta t \Delta f) = N/M = p$$

when an integral number of periods are spanned, the physical frequency coincide with one of the frequencies at which the DFS is computed.

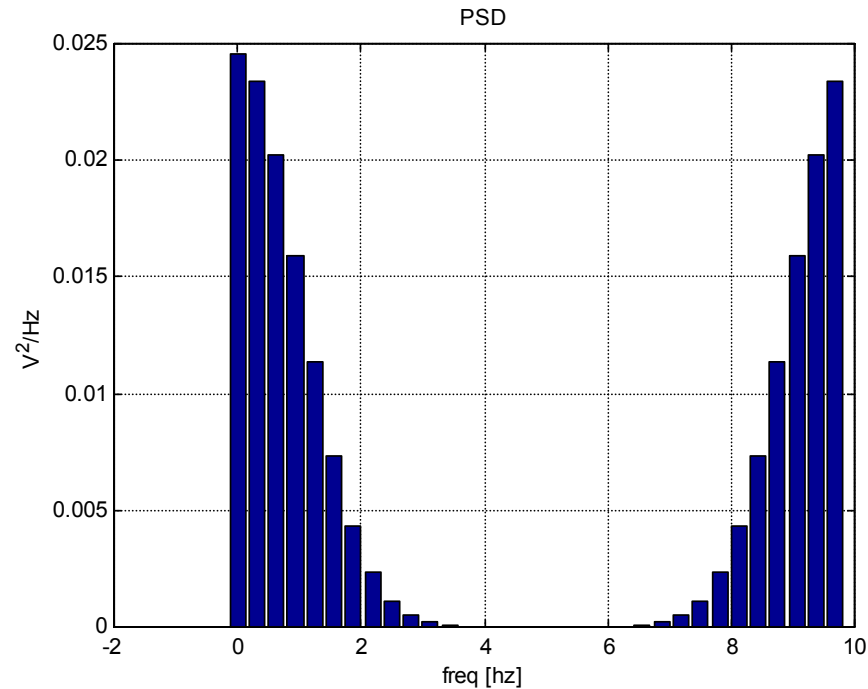


Signal Processing: Spectral Analysis

## Random continuous signals:

$$P = \int_{-\infty}^{\infty} S(f) df$$

$$P_{f_1-f_2} = \int_{f_1}^{f_2} S(f) df \quad S(k\Delta f) = \frac{\Delta T}{N} |X(k\Delta f)|^2$$



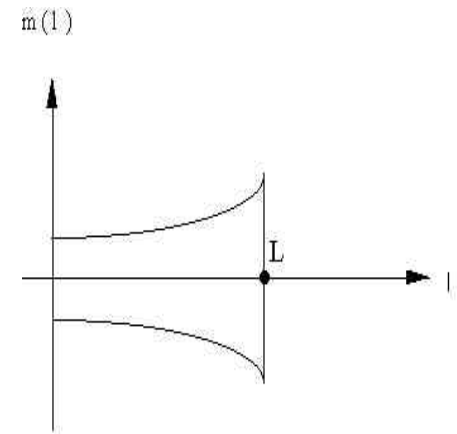


## Distribution Function

$$Q = \int_{\alpha_1}^{\alpha_2} q(\alpha) d\alpha$$

Example - mass distribution

$$M = \int_{\ell_1}^{\ell_2} m(b) d\ell$$



Example Power Distribution in the frequency domain

PSD = Power Spectral Density

$$P = \int_{f_1}^{f_2} S(f) df$$

# Spectral Analysis

## *Engineering Units*

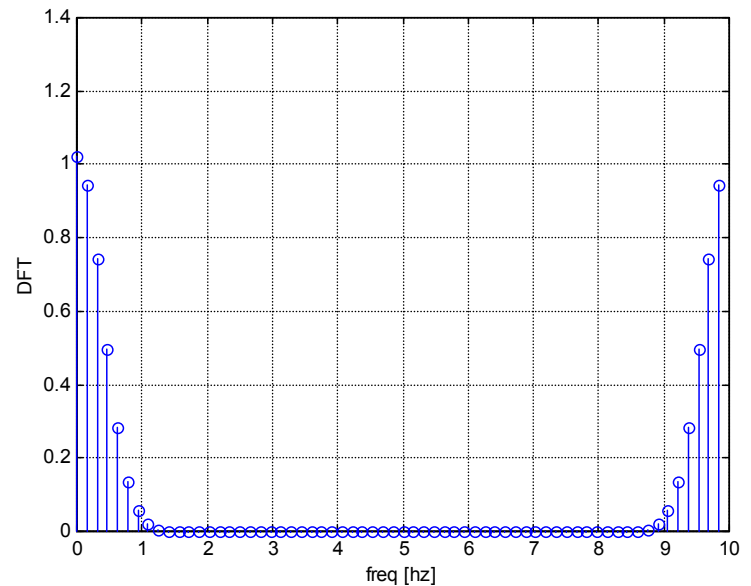
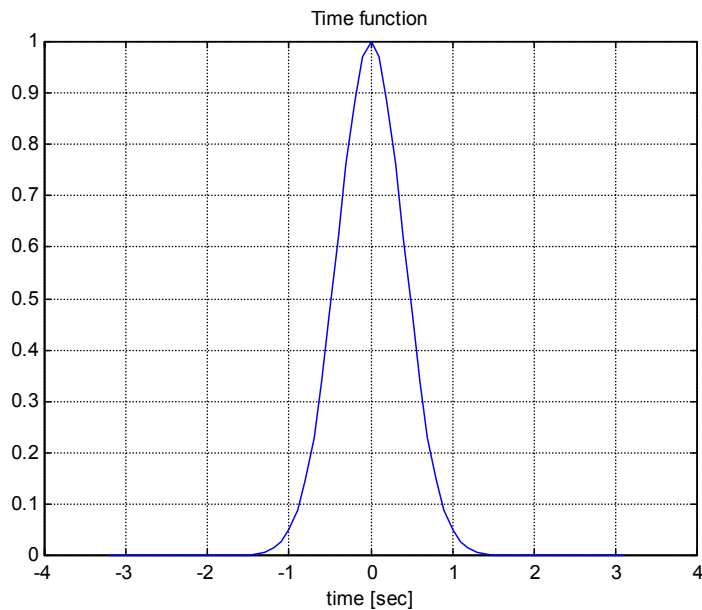
- $x()$  en Volts
- **Power**      **PSD**      **Energy**      **ESD**
- $V^2$        $V^2/\text{Hz}$        $V^2.\text{sec}$        $V^2.\text{sec}/\text{Hz}=V^2.\text{sec}^2$
- Voltage units
- $V$        $V/\sqrt{\text{Hz}}$        $V.\sqrt{\text{sec}}$        $V.\text{sec}$

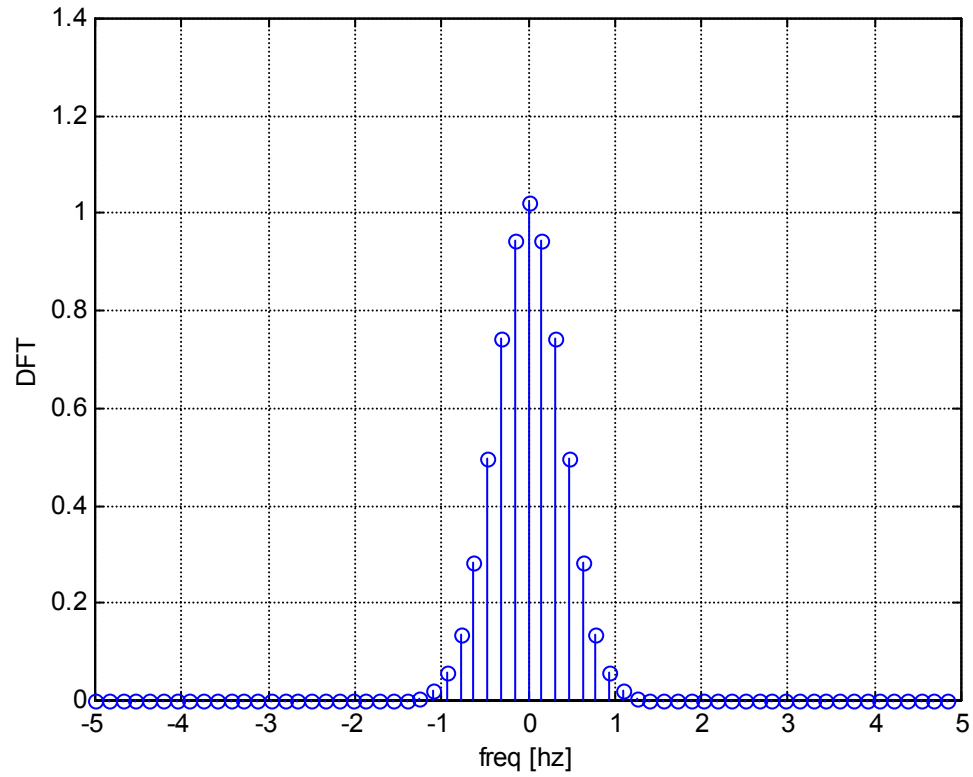
## Frequency scales, one and two sided presentations :

The (computational) resolution is  $\Delta f = 1/(N/\Delta t)$  , the frequency scale is  $f(k) = k\Delta f$

the locations  $k = N-1, N, \dots, N/2$

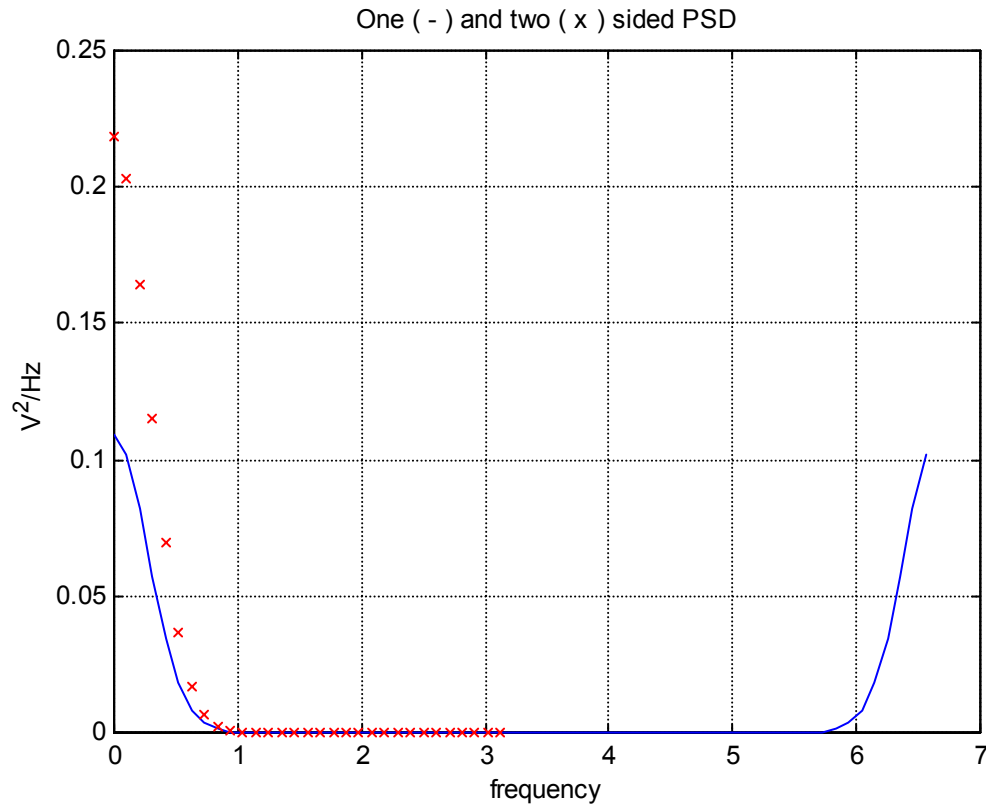
correspond to negative frequencies according to:  $X(-k) = X(N-k)$

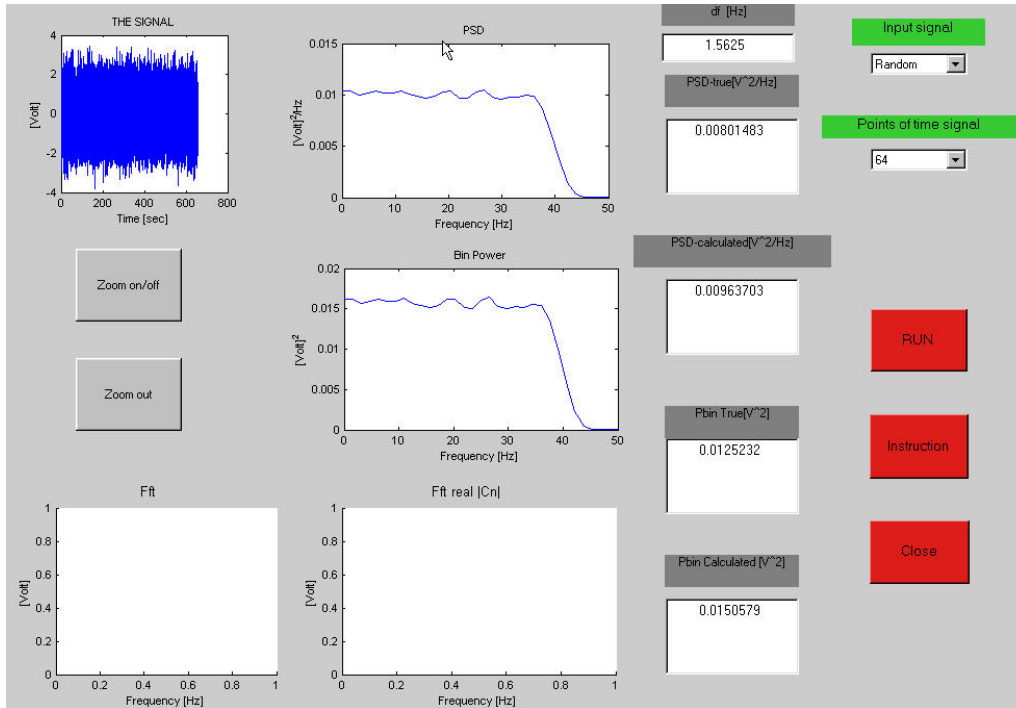




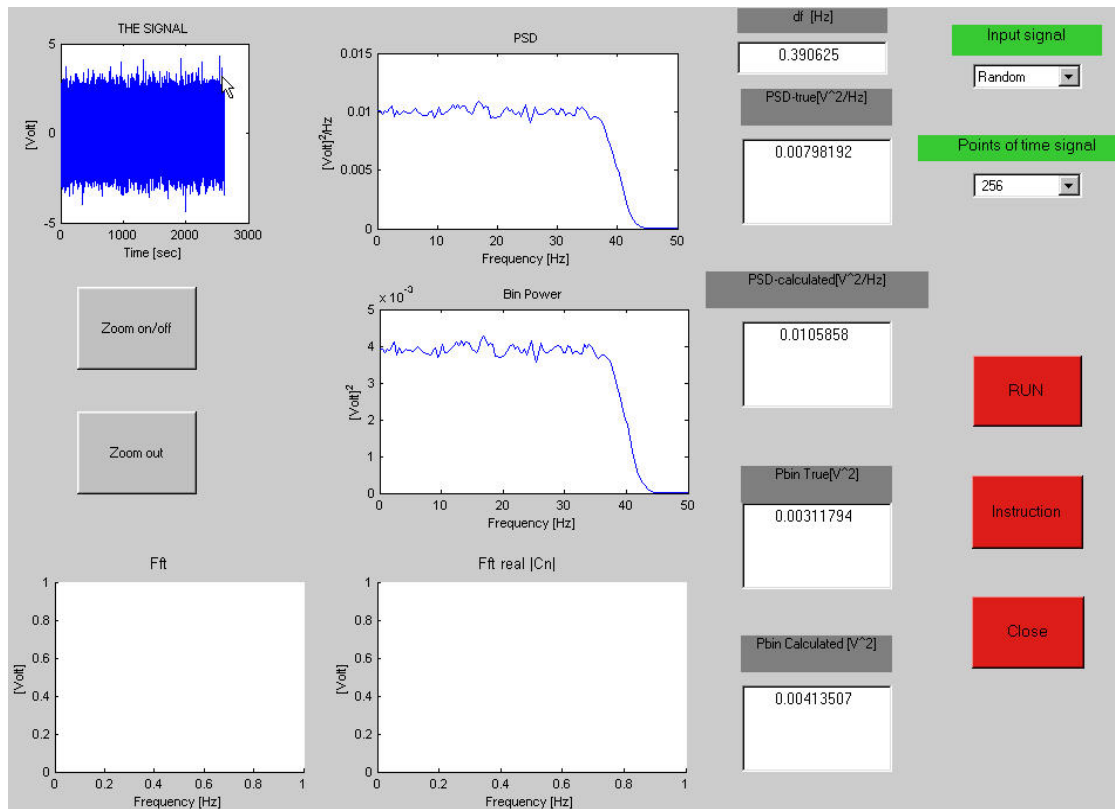
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$$X_1(k) = \begin{cases} X(k) & k = 0, k = N/2 \\ 2X(k) & k = 1, 2, \dots, N/2 - 1 \end{cases} \quad G(k) = \begin{cases} S(k) & k = 0, k = N/2 \\ 2S(k) & k = 1, 2, \dots, \frac{N}{2} - 1 \end{cases}$$





Signal Processing: Spectral Analysis



Signal Processing: Spectral Analysis

## The uncertainty principle :

For any reasonable definition

$$(\text{Time duration}) \times (\text{Frequency bandwidth}) > C$$

given a signal length  $T_t$ , two components separated by

$f_2 - f_1 = 1/T_t$  will not be separated by *any* signal

processing techniques.



## Transient analysis and zero padding

The frequency resolution is  $\Delta f_{transient} = \frac{1}{n\Delta T}$

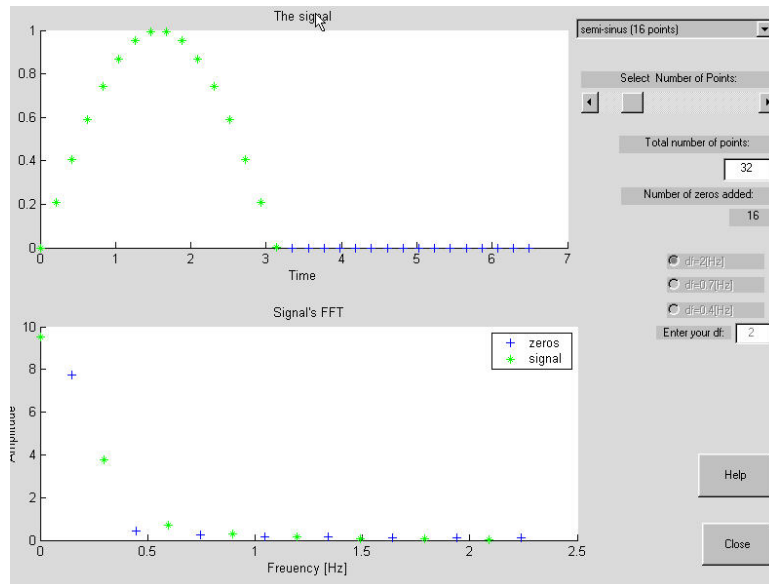
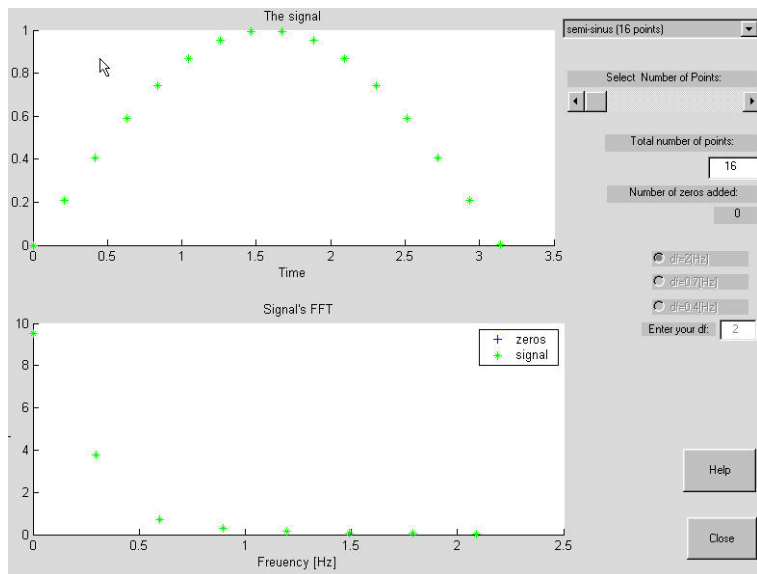
$N-n$  zeros are now appended to the signal, resulting in total span of  $N$  points. The computational resolution is

$$\Delta f = \frac{1}{N\Delta T} < \Delta f_{transient}$$

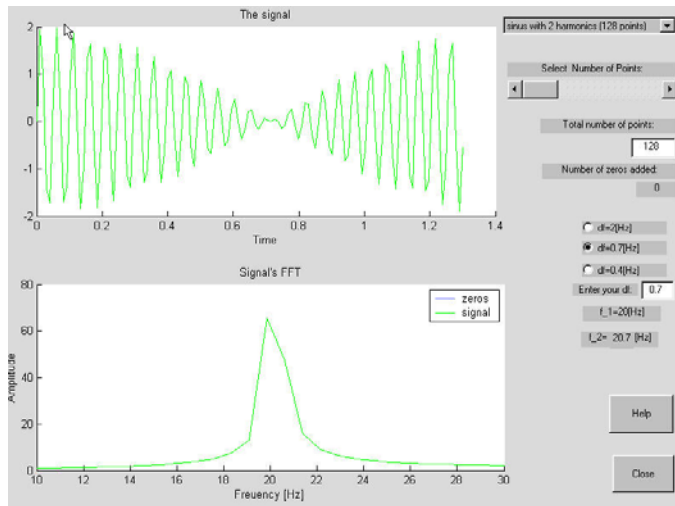
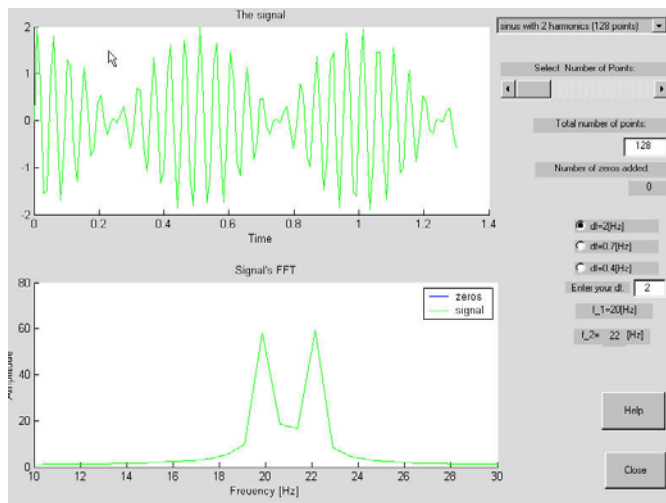
The DFT

$$X(k) = \sum_{i=0}^{n-1} x(i) \exp(-j \frac{2\pi}{N})^{ik} + \sum_{i=n}^N 0 \exp(-j \frac{2\pi}{N})^{ik}$$

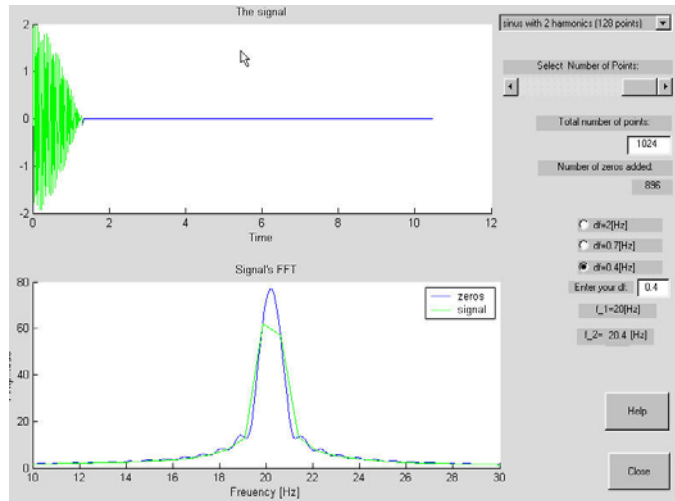
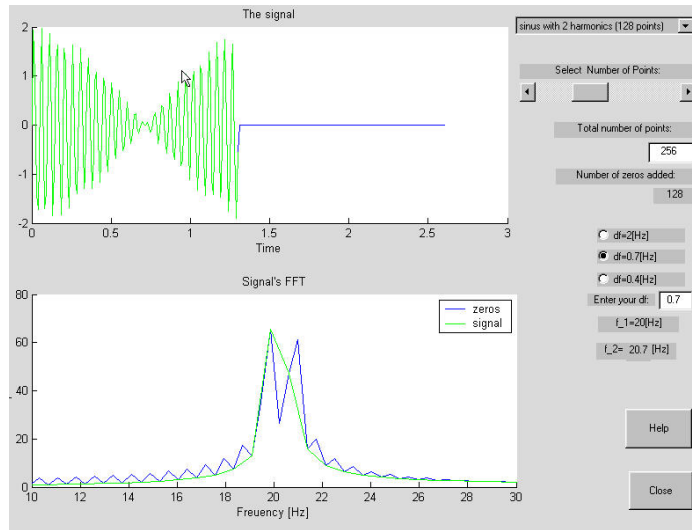
Nothing is contributed to  $X(k)$  by the second term.



## Signal Processing: Spectral Analysis



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## Signal Processing: Spectral Analysis

## **Performance, errors and controls:**

The main error mechanisms in spectral analysis

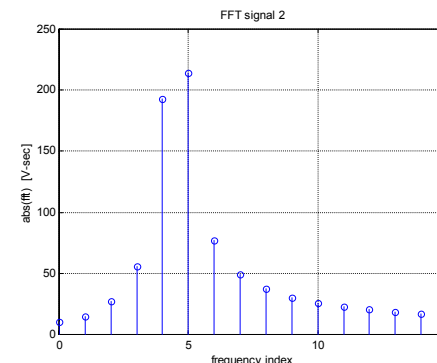
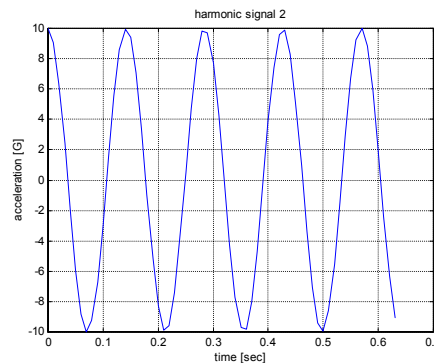
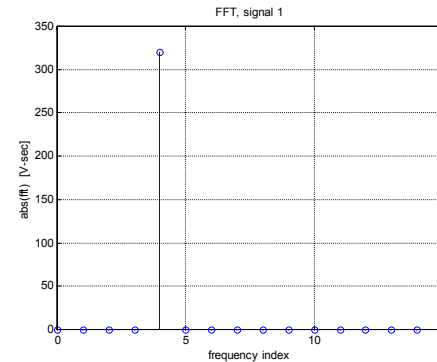
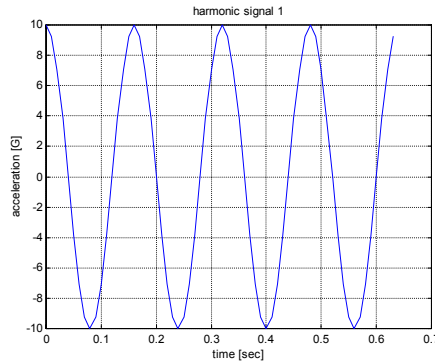
- Alias errors
- Leakage errors
- Random errors
- Bias errors

# Periodic signals -Leakage

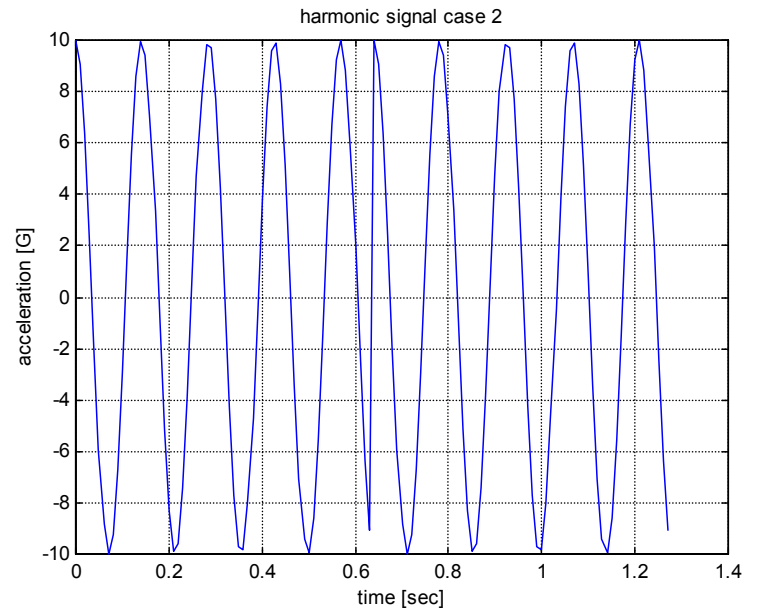
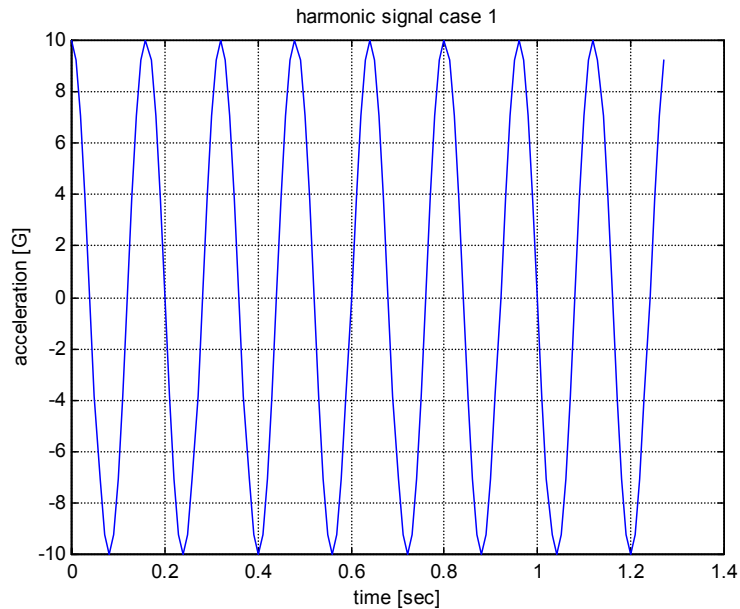
For periodic signals , with period  $T_p$ , the physical frequencies are

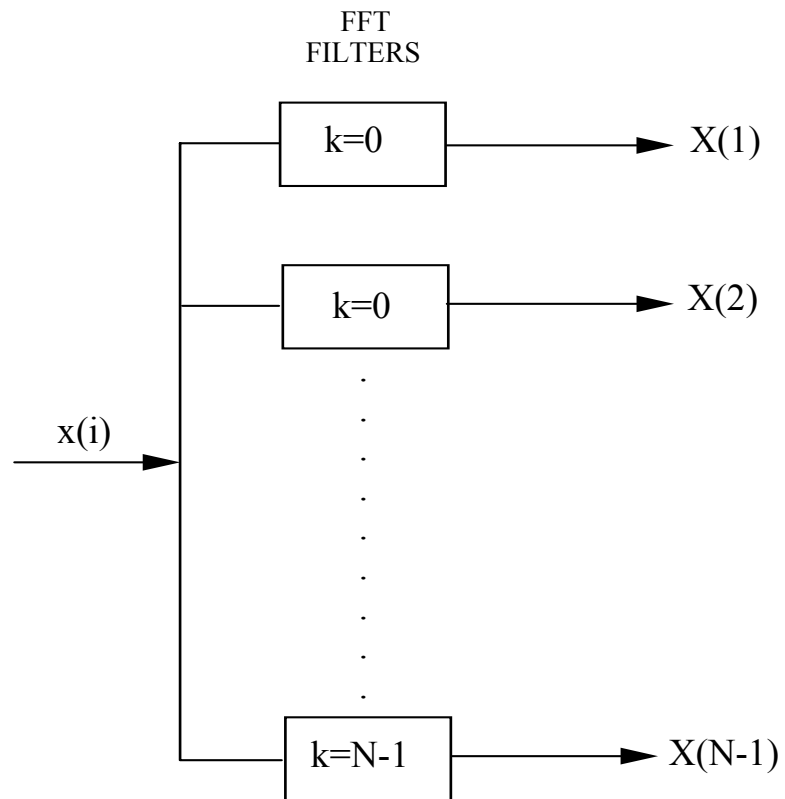
$$k/ T_p, \text{ with } k=1,2,\dots$$

The computed frequencies will be located at  $k\Delta f = k/(N\Delta t)$



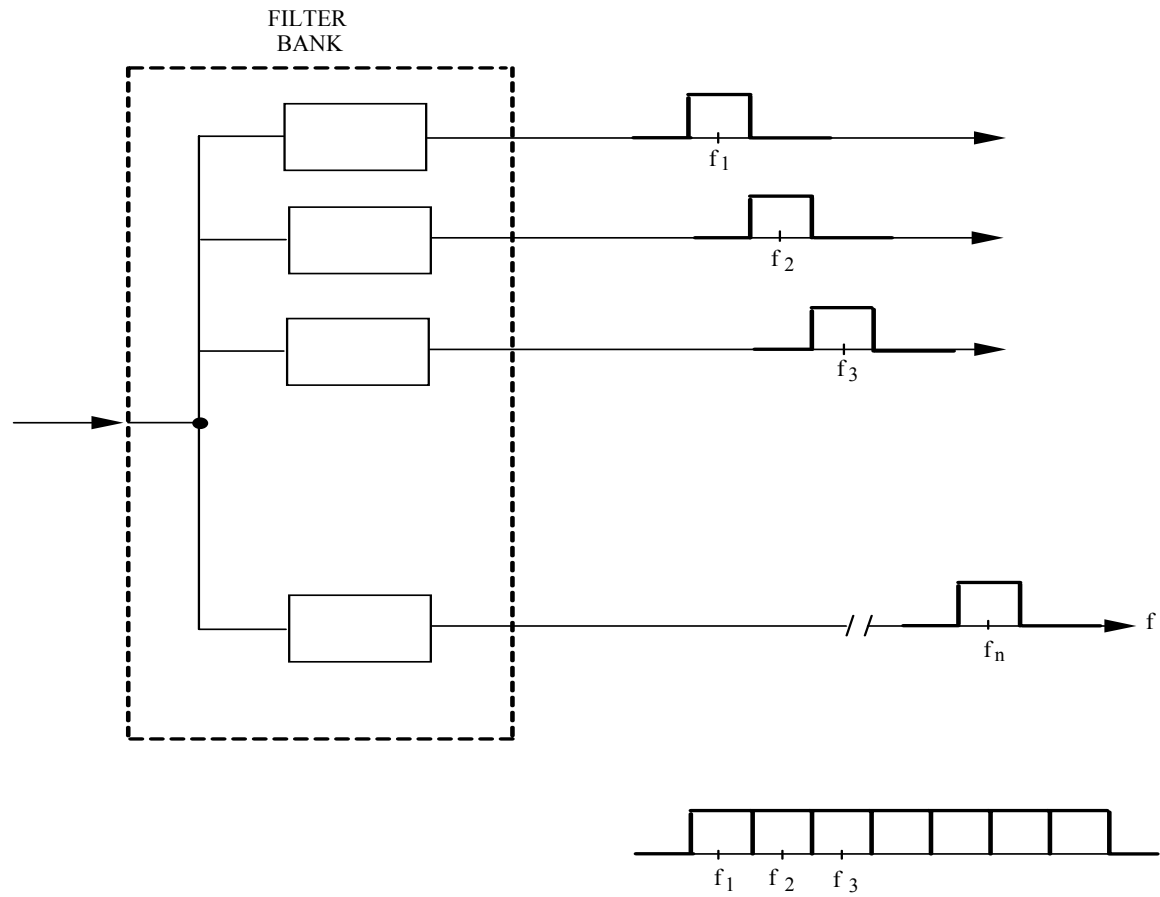
No discontinuities exist when extending periodically an harmonic (or any periodic) signal composed of an integer number of periods.



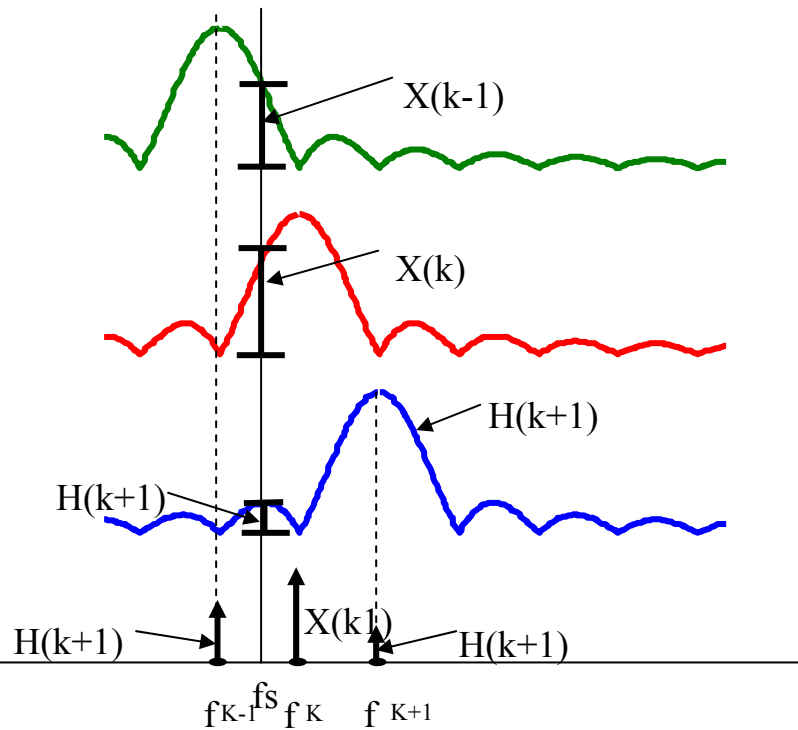


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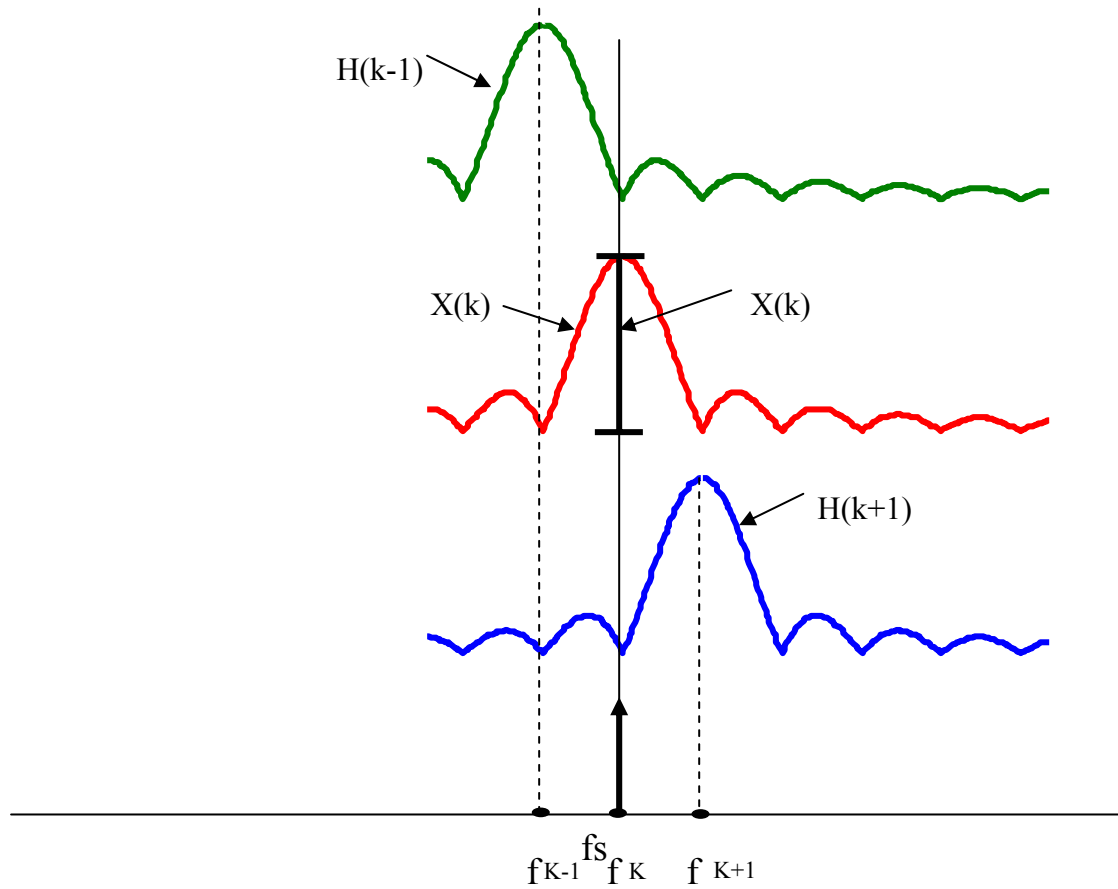




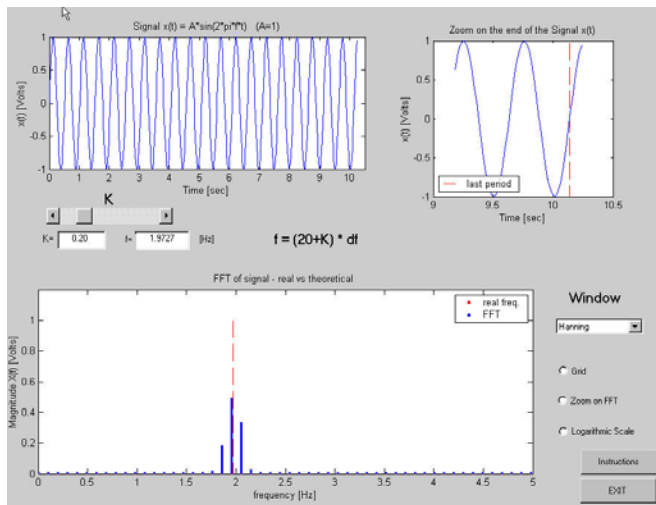
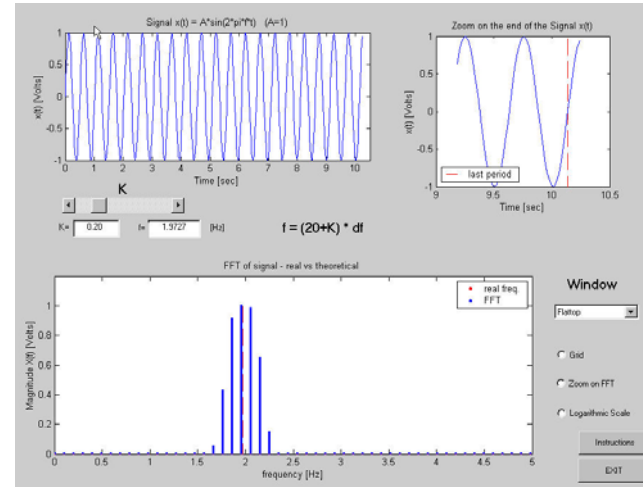
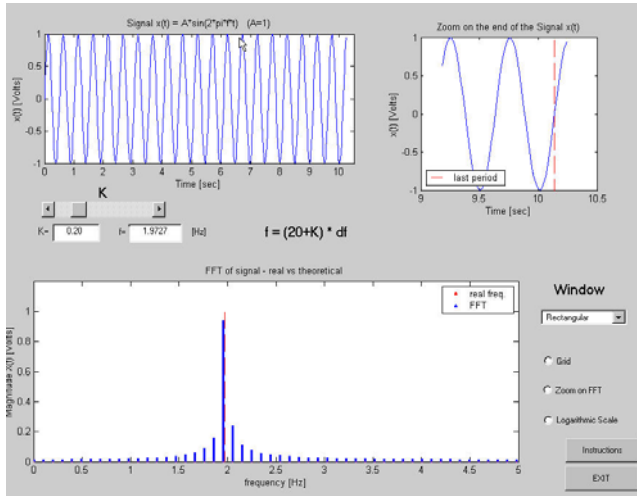
Signal Processing: Spectral Analysis



Signal Processing: Spectral Analysis

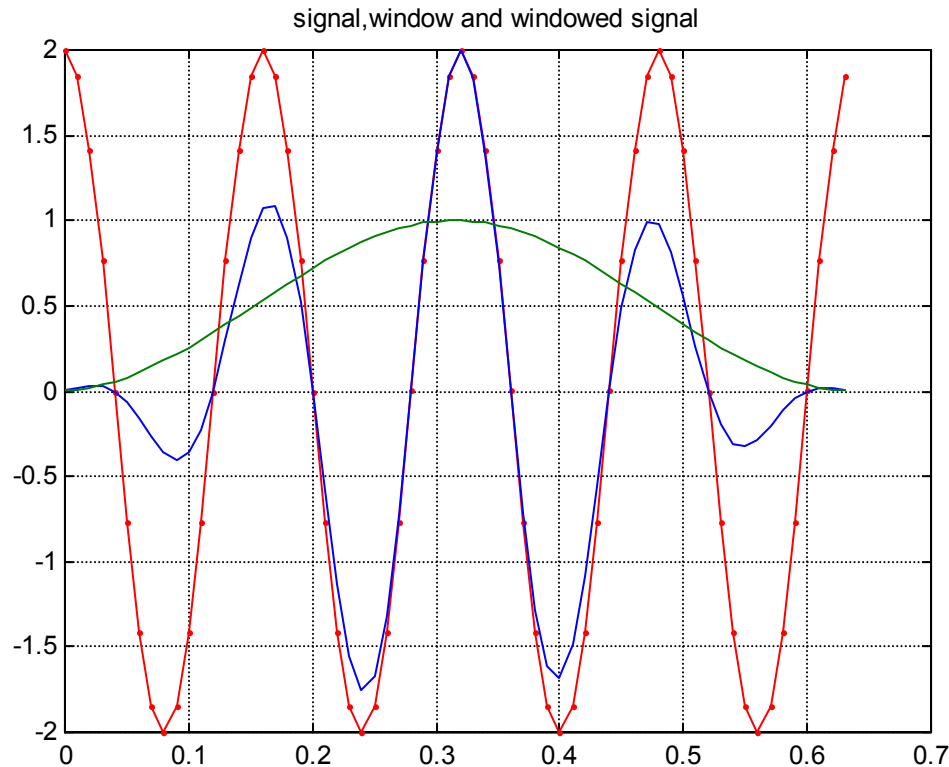


Signal Processing: Spectral Analysis



## Signal Processing: Spectral Analysis

Give diminishing weights to the signals beginning and end by means of suitable windows.



The windowing is undertaken by multiplying the time signal by the appropriate window function.

$$x'(i) = w(i)x(i)$$