



## MEscope Application Note 38

# Digital Signal Processing

The steps in this Application Note can be carried out using any MEscope package that includes the **VES-3600 Advanced Signal Processing** option. Without this option, you can still carry out the steps in this App Note using the **AppNote38** project file. These steps might also require a *more recent release date* of MEscope.

### APP NOTE 38 PROJECT FILE

- To retrieve the Project for this App Note, [click here](#) to download **AppNote38.zip**

This Project file contains *numbered Hotkeys & Scripts* for carrying out the steps of this App Note.

- Hold down the Ctrl key and click on a Hotkey** to open its Script window

### THE FFT AND THE DFT

The **FFT** is a *computer algorithm* that calculates the **Digital Fourier Transform (DFT)** of a *uniformly sampled* time waveform. *Three equations* govern the **FFT** algorithm.

#### 1. SAMPLED TIME WAVEFORM EQUATION

The **FFT** *assumes* that the time waveform contains **N** *uniformly spaced samples*

The *spacing* (or *resolution*) between time samples is denoted as  $\Delta t$  (in seconds)

The sampling time period (also called the *sampling window*), spans the time period ( $t \rightarrow 0$  to **T**) (in seconds)

The time waveform parameters are related by the equation,

$$T = N (\Delta t) \text{ (in seconds)}$$

#### 2. DIGITAL FOURIER TRANSFORM (DFT) EQUATION

The **DFT** contains  $(N/2)$  *uniformly spaced samples* of *complex (magnitude & phase)* data

The *spacing* (or *resolution*) between frequency samples is denoted as  $\Delta f$  (in Hz)

The **DFT** is calculated over a frequency span ( $f \rightarrow 0$  to **Fmax**) (in Hz)

The **DFT** parameters are related by the equation,

$$F_{\max} = (N/2) \Delta f \text{ (in Hz)}$$

#### 3. SHANNON'S (NYQUIST) SAMPLING CRITERION

Shannon's Sampling Criterion says that *to calculate an accurate DFT* over the span ( $f \rightarrow 0$  to **Fmax**),

The time waveform *must be sampled at no less than twice* the frequency **Fmax**

The minimum sampling rate is called the *Nyquist sampling rate*

The sampling criterion relates **Fmax** and the *Nyquist sampling rate* by the equation,

$$\text{Nyquist sampling rate} \rightarrow 1/\Delta t = 2 F_{\max} \text{ (in Hz)}$$

This formula states that to obtain a valid **DFT**, a digital time waveform *must be sampled at twice* the expected value of **Fmax**.

## FUNDAMENTAL SAMPLING RULE

Another important equation is derived from the three equations above.

$$\Delta f = 1/T \quad (\text{in Hz})$$

This equation says that the *frequency resolution* ( $\Delta f$ ) of the **DFT** is the *inverse of the time length* ( $T$ ) of the time domain sampling window.

## SAMPLING RATE VERSUS FREQUENCY RESOLUTION

To *increase the frequency resolution* (reduce  $\Delta f$ ) of a **DFT**, the time domain signal *must be sampled over a longer time period* ( $T$ ).

*Increasing the sampling rate* ( $1/\Delta t$ ) of the time waveform *does not increase the frequency resolution* (reduce  $\Delta f$ ) of its **DFT**.

## ANTI-ALIASING FILTERS

When a continuous analog time domain signal is sampled, *frequencies higher than  $F_{\max}$*  in the signal *will fold back* and appear as lower frequencies in the **DFT**.

These *aliased high frequency components* are not part of the **DFT** at *frequencies below  $F_{\max}$*  in the original signal.

To ensure that no frequencies higher than  $F_{\max}$  are contained in a **DFT**, higher frequencies must be removed from the analog time waveform *before it is sampled*.

Frequencies higher than  $F_{\max}$  are removed using an *analog low pass filter called an anti-aliasing filter*.

Passing a time waveform through an anti-aliasing filter *before sampling it* ensures that all frequency components higher than  $F_{\max}$  are removed from the *frequency span*  $\rightarrow 0$  to  $F_{\max}$  of the **DFT**.

All anti-aliasing filters have a *finite roll off frequency band*.

If the *cutoff frequency* (start of the filter roll off) is set to **80%** of  $F_{\max}$ , or **40%** of the *sampling frequency*, then **80%** of a frequency span  $\rightarrow 0$  to  $F_{\max}$  will be *alias-free*.

Most **FFT** analyzers have anti-aliasing filters with a *cutoff frequency* set to **80%** of  $F_{\max}$ , or **40%** of the *sampling frequency*.

## FOURIER SPECTRUM (DFT)

Several types of frequency spectra can be calculated in MEScope.

The Fourier spectrum is the **DFT** of a time waveform

The **FFT** algorithm is used to calculate the **DFT** of a time waveform

The **DFT** is *complex valued*, with **Real & Imaginary** parts, or **Magnitude & Phase**

## AUTO SPECTRUM

Each Auto spectrum estimate is calculated by *multiplying a DFT by its own complex conjugate*

An *average Auto spectrum* is calculated by averaging together multiple Auto spectra

An Auto spectrum is *real-valued, with Magnitude only*

## CROSS SPECTRUM

Each Cross spectrum estimate is calculated by multiplying the **DFT** of one signal by the *complex conjugate* of the **DFT** of a different signal

An *average Cross spectrum* is calculated by averaging together multiple Cross spectra

The Cross spectrum is *complex valued*, with **Real & Imaginary** parts, or **Magnitude & Phase**

## POWER SPECTRAL DENSITY (PSD)

A **PSD** is an Auto spectrum *divided by the frequency resolution* of the Auto spectrum

If the units of an Auto spectrum are ( $g^2$ ), the units of its corresponding **PSD** are ( $g^2 / Hz$ )

## ENERGY SPECTRAL DENSITY (ESD)

An **ESD** is a **PSD multiplied by the time length (T)** of the time waveform used to create the spectrum

If the units of a **PSD** are ( $g^2 / Hz$ ), the units of its corresponding **ESD** are ( $g^2 \cdot sec / Hz$ )

**ESDs** are used mostly to characterize transient signals

## TIME DOMAIN WINDOWS

The **FFT** algorithm assumes that the time waveform to be transformed is *periodic in its sampling window*.

A signal is *periodic in its sampling window* if it satisfies one of the following criteria,

1. An *integer number of cycles* of the signal are contained within its sampling window
2. The signal has *no discontinuity* between its beginning & end in its sampling window
3. The signal is *completely contained* within its sampling window

## NON-PERIODIC SIGNAL

Many signals are *non-periodic* in their sampling window.

A *purely random signal* is *non-periodic (never completely contained)* within a finite length sampling window.

## WHAT IS LEAKAGE?

If a time waveform is *non-periodic in its sampling window*, a *smearing of its spectrum* (called *leakage*) will occur when it is transformed to the frequency domain as a **DFT**.

Leakage *distorts* the spectrum, especially around resonance peaks.

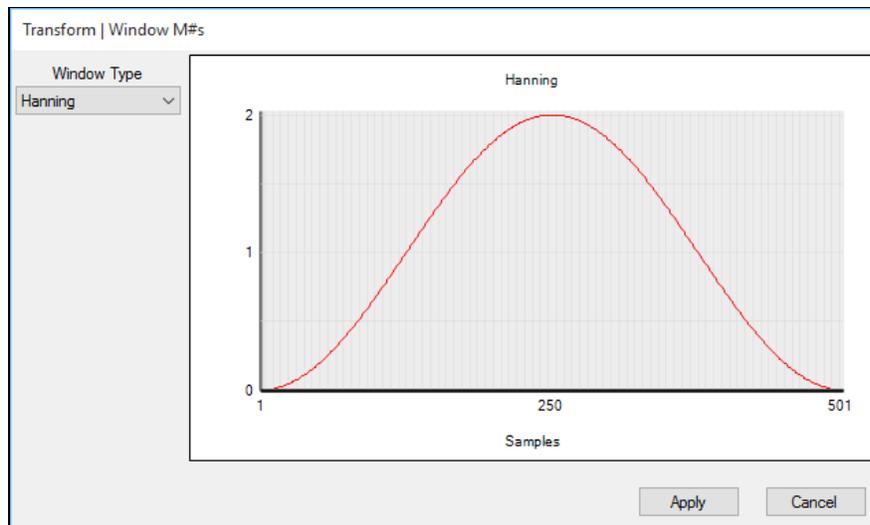
Leakage *spreads* the spectrum surrounding resonance peaks, which is detrimental for modal parameter estimation (curve fitting).

Leakage *is reduced* by multiplying the sampled time waveform by a *special weighting function* (called a **time domain window**), *before* the **FFT** is applied to the time waveform.

## HANNING WINDOW FOR BROADBAND SIGNALS

If a time waveform is *non-periodic in its sampling window*, leakage *cannot be eliminated*, but it *can be reduced*.

A Hanning window *reduces the leakage* in the spectrum of a *broad band signal* such as a random signal.



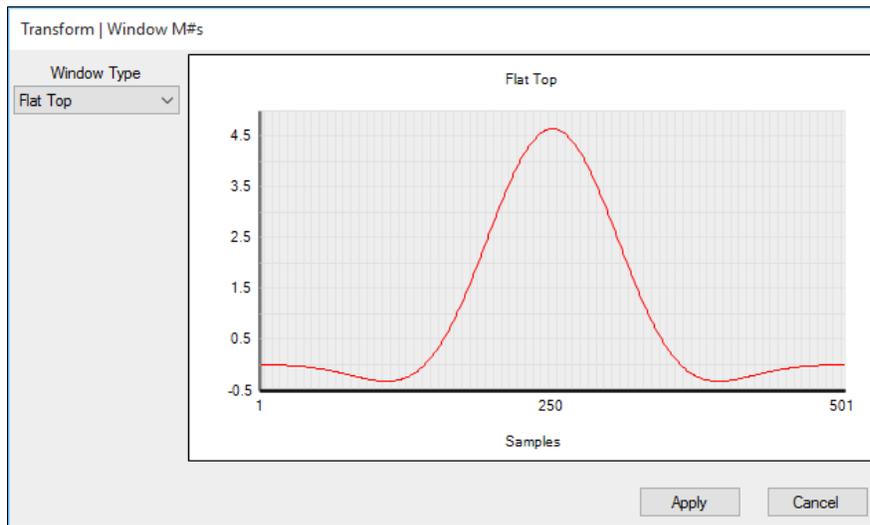
*Hanning Window.*

## FLAT TOP WINDOW FOR NARROW BAND SIGNALS

A Flat Top window makes the *magnitudes of peaks more accurate* in the **DFT** of a *narrow band signal* such as a sinusoidal signal.

A Flat Top window also *reduces leakage* in the spectrum of a *narrow band signal*.

A Flat Top window also *makes the peaks wider* in the spectrum of a *narrow band signal*.



*Flat Top Window.*

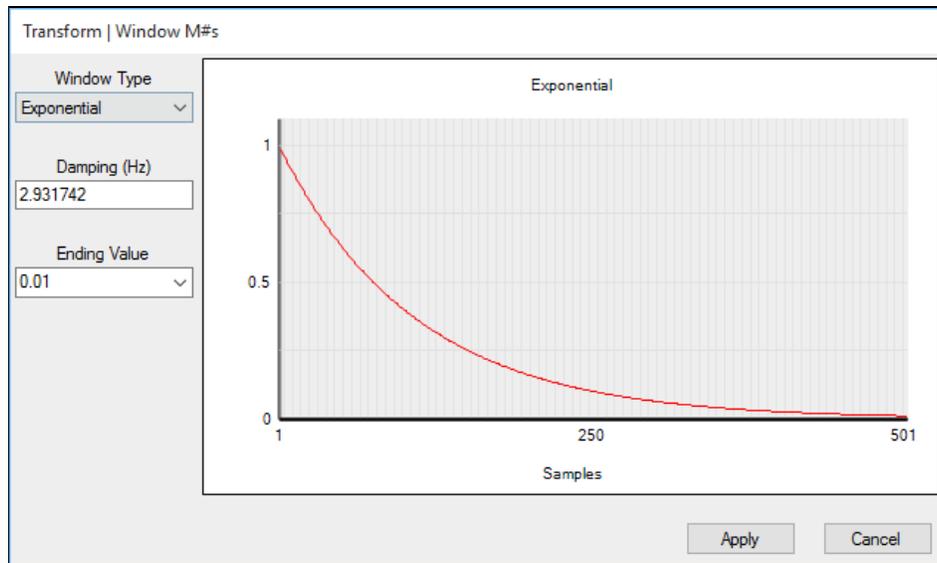
## EXPONENTIAL WINDOW FOR TRANSIENT SIGNALS

A **decreasing Exponential window** should be applied to transient (or impulse response) signals that **do not decay completely** within their sampling window

A **decreasing Exponential window** **artificially damps** the signal toward zero before the end of its sampling window, thus making it **nearly periodic in its sampling window**.

An Exponential window **adds a fixed amount of damping** to all the decay waveforms in an impulse response.

Following curve fitting in MEScope, the artificial damping added by an Exponential window **is subtracted from the damping estimates** of all modes.



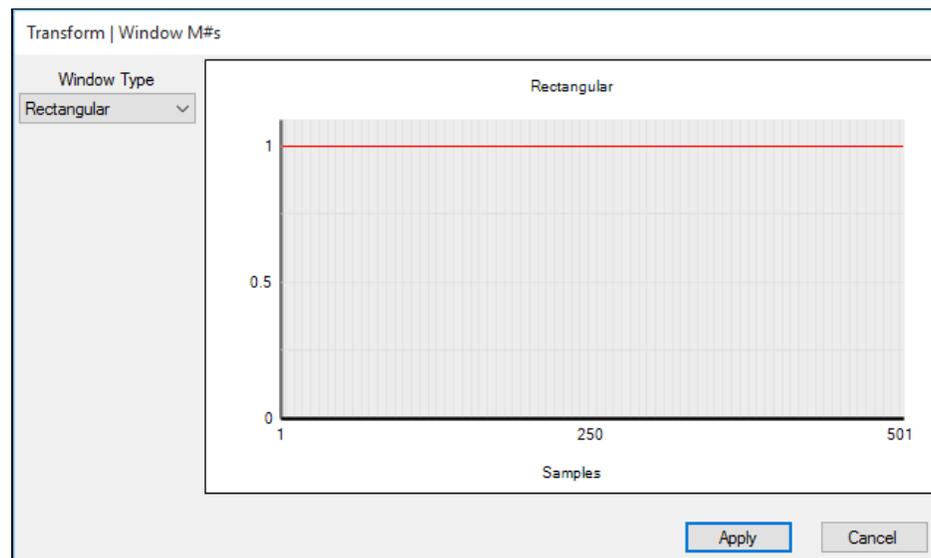
*Exponential Window.*

## RECTANGULAR WINDOW FOR PERIODIC SIGNALS

A Rectangular window is used on a signal that is **periodic (or nearly periodic)**, in its sampling window

All values of a rectangular window → "1"

This window is also called a **Box Car** window or **No** window



*Rectangular Window.*

## SPECTRUM AVERAGING

Spectrum averaging is used for two important reasons,

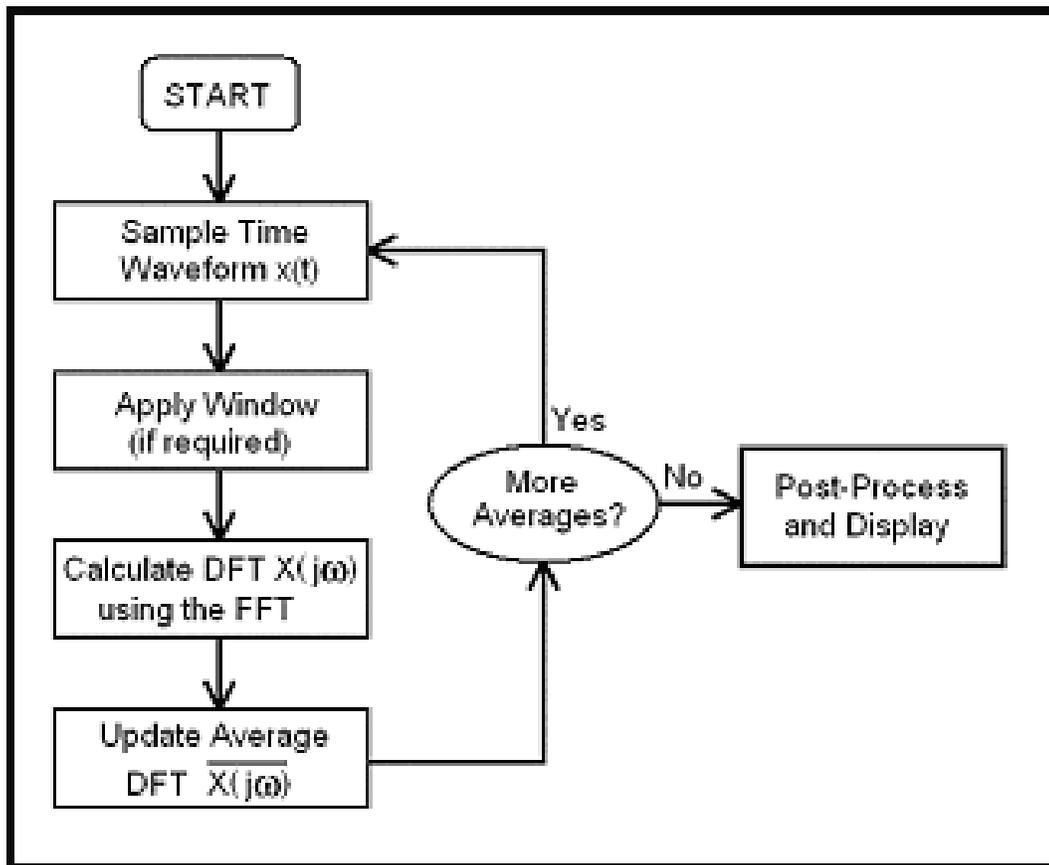
1. *To remove extraneous random noise* from the **DFT** of a signal
2. *To remove randomly excited non-linearities*, which appear as random noise in the **DFT**

The time waveform **Block Size (number of samples)** is twice the **Block Size (number of samples)** in its corresponding DFT

$$\text{Time Waveform Block Size} = 2 \text{ DFT Block Size.}$$

The following steps are carried out during spectrum averaging by the **Transform | Spectra** command in the Data Block window.

1. Each time waveform is divided into *several smaller sampling windows*
2. Each sampling window is *windowed (multiplied by a time domain window)* to reduce leakage in its spectral estimate
3. Each *windowed time waveform* is transformed into its **Digital Fourier Transform (DFT)** using the **FFT**
4. An Auto spectrum estimate is calculated from *each DFT*
5. Multiple Auto spectrum estimates are *averaged* together to yield a single Auto spectrum for each **M#** in the original Data Block



*Spectrum Averaging Calculation Loop*

## NUMBER OF AVERAGES

Depending on the Block Size of the time waveforms in a time domain Data Block, two cases can occur,

**DFT Block Size → 1/2 (Time Waveform Block Size)**

In this case, only one spectrum estimate can be calculated using *all the time waveform samples*.

**DFT Block Size → less than 1/2 (Time Waveform Block Size)**

In this case, a large time domain waveform can be divided into many smaller sampling windows, and spectrum averaging can be performed.

## OVERLAP PROCESSING

Overlap processing divides each time waveform into a series of smaller *overlapping sampling windows*.

The percentage of overlap of the sampling windows depends on three parameters,

1. The **time waveform Block Size** (the total number of time waveform samples)
2. The **spectrum Block Size**
3. The **Number of Spectrum Averages**

Increasing the Number of Spectrum Averages *increases the percentage* of overlap processing

**50 % Overlap** means that *half of the time waveform samples are used over again* in each successive sampling window

**0% Overlap** means that *unique time waveform samples* are used for each new sampling window

## LINEAR (OR STABLE) AVERAGING

Linear averaging is the same as *summing together* all the spectral estimates and *dividing by the number of averages*.

A *stable averaging* formula is used for linear spectrum averaging. Each stable average is calculated using a weighted sum of the current spectrum estimate and the preceding stable average.

The  $N^{\text{th}}$  *stable average* is calculated with the following formula,

$$\text{Stable Average (N)} = (1/N) \text{ Spectrum (N)} + (1 - (1/N)) \text{ Stable Average(N-1)}$$

## PEAK HOLD AVERAGING

Peak Hold averaging *retains the maximum value* at each sample from all spectral estimates.

The  $I^{\text{th}}$  sample of the  $N^{\text{th}}$  average is determined with the formula,

$$\text{Peak Average (N,I)} = \text{Maximum (Spectrum (I) , Peak Average(N-1,I))}$$

## STEP 1 - FOURIER SPECTRUM OF PERIODIC SINE WAVES

- **Press Hotkey 1 Fourier Spectrum of Periodic Sine Waves**

To illustrate the calculation of a Fourier spectrum, a Data Block file with a time waveform containing *three periodic sine waves* was created using the **File | New | Data Block** command. The waveform was saved in **BLK: 20 30 50 Hz Sine Waves**.

When **Hotkey 1** is *pressed*, two Data Block windows will open. The Data Block **BLK: 20 30 50 Hz Sine Waves** is displayed *on the left* and contains a time waveform with **20,000 samples** of sinusoidal data in it.

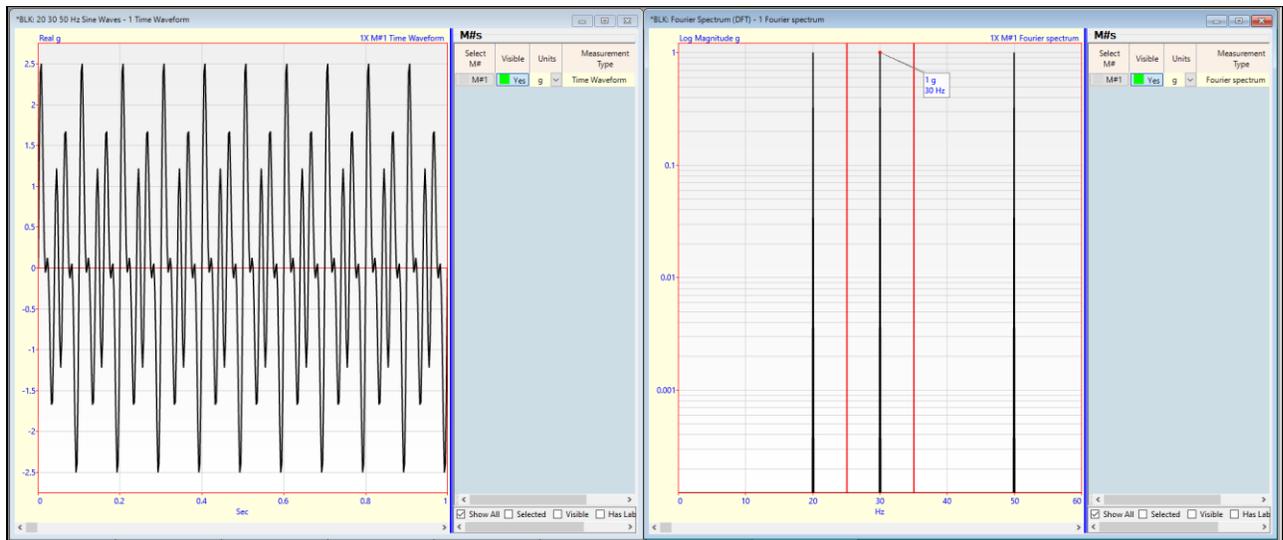
**BLK: 20 30 50 Hz Sine Waves** contains data for a **T → 50** seconds, but *only 0 to 1 seconds* of data is displayed

The Data Block **BLK: Fourier Spectrum (DFT)** is displayed *on the right* and contains the Fourier spectrum (**DFT**) of the time waveform in **BLK: 20 30 50 Hz Sine Waves**. The **DFT** has three peaks at **20, 30 & 50 Hz** with **magnitude = 1** and **phase = 0**.

**BLK: Fourier Spectrum (DFT)** has a frequency span **→ 0 to 200 Hz** but *only 0 to 60 Hz* is displayed

The **Peak cursor** in the Fourier spectrum shows a **magnitude = 1g** for the **30 Hz peak**

The frequencies of the three sine waves (**20, 30, 50**) Hz divide evenly into **200 Hz**, hence they are periodic in the 20,000 sample time domain window and there is no leakage in their spectrum



*Fourier Spectrum (DFT) of a Periodic Signal Containing Three Sine Waves.*

## ONE-SIDED VERSUS TWO-SIDED FFT

The Fourier Transform is defined as an integral over *all frequencies, positive & negative*.

The **DFT** is also defined over *all frequencies, positive & negative*.

The spectrum for the negative frequencies has the same information in it as the spectrum for the positive frequencies.

Therefore, *only the DFT for positive frequencies* is displayed in MEscape.

A **One-Sided FFT** assigns *all the energy* from the time waveform to the *positive frequencies* of its **DFT** (the part that is displayed)

A **Two-Sided FFT** assigns *half of the energy* to the *positive frequencies* and half of the energy to the *negative frequencies* of its **DFT**

**DFT** values from a **One-Sided FFT** are *twice as large* as the **DFT** values from the **Two-Sided FFT**

## STEP 2 - SPECTRUM AVERAGING USING A FLAT TOP WINDOW

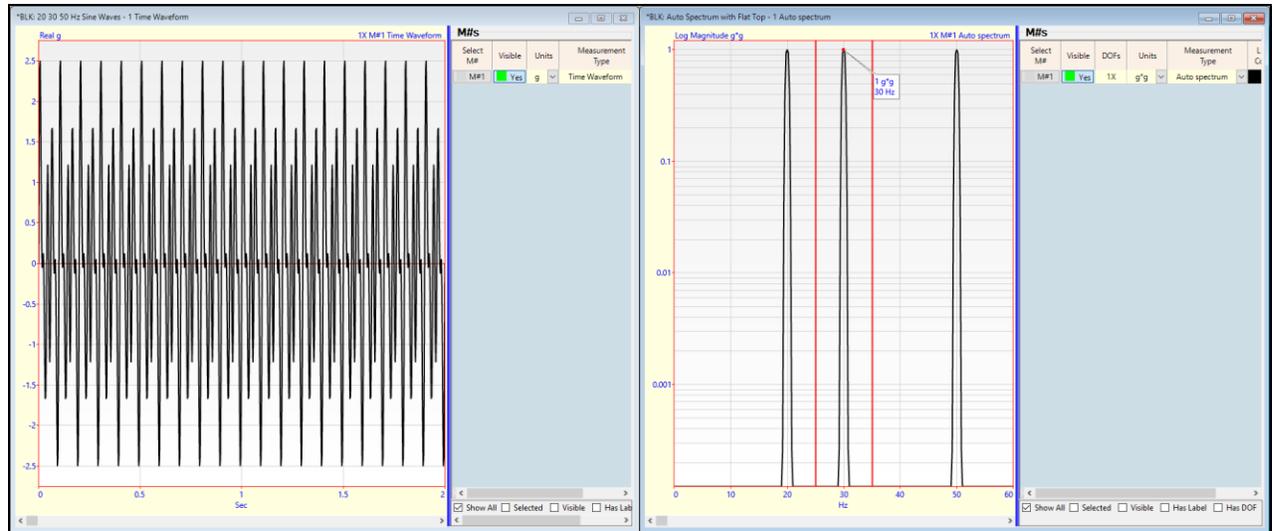
- **Press Hotkey 2 Auto Spectrum with Flat Top**

When **Hotkey 2** is *pressed*, two Data Block windows will open. The Data Block **BLK: 20 30 50 Hz Sine Waves** is displayed *on the left* and contains a time waveform with **20,000 samples** of sinusoidal data in it.

**BLK: 20 30 50 Hz Sine Waves** contains data for a **T** → **50** seconds, but *only 0 to 1 seconds* of data is displayed

The Data Block **BLK: Auto Spectrum** is displayed *on the right* contain the Auto spectrum which has three peaks at **20, 30 & 50 Hz** with **magnitude = 1** & **phase = 0**.

**BLK: Auto Spectrum** has a frequency span → **0 to 200 Hz** but *only 0 to 60 Hz* is displayed



*Auto Spectrum of a Periodic Signal Containing Three Sine Waves With a Flat Top Window Applied.*

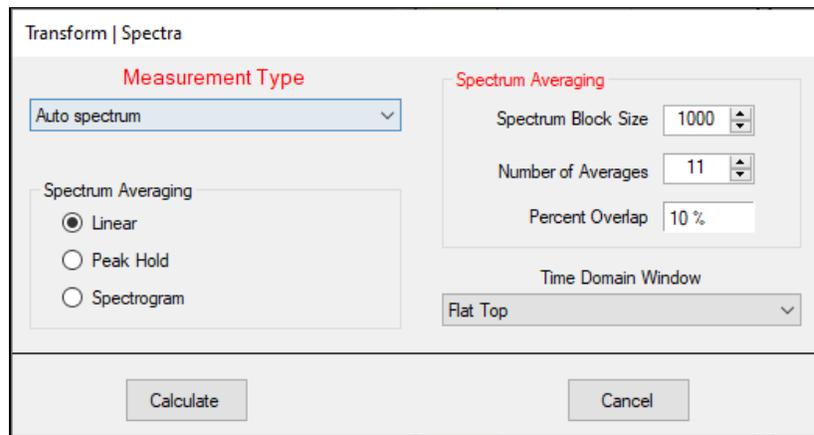
The **Peak cursor** value in the Auto spectrum shows the **magnitude of 1 g\*g** for the **30 Hz sine wave**.

## OVERLAP PROCESSING

Now the calculations done when **Hotkey 2** was *pressed* will be done manually

- **Right click** in Data Block **BLK: 20 30 50 Hz Sine Waves** and execute **Transform | Spectra**

The following dialog box will open.



*Transform | Spectra Dialog Box.*

- Verify that **Spectrum Block Size** → **1000**, **Number of Averages** → **11**, and **Percent Overlap** → **10%**

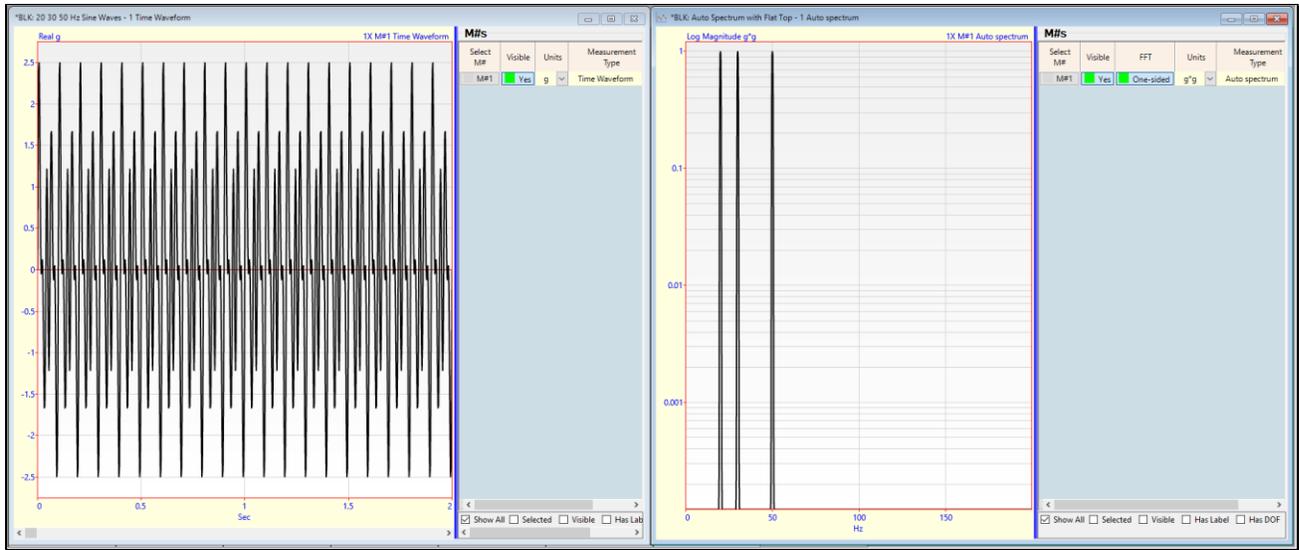
This means that to calculate **11 Auto spectra** and average them together, **10 percent** of the time waveform samples will be used over again in *each successive sampling window*.

## TIME DOMAIN WINDOW

When spectrum averaging is used, data that is *periodic for all samples* in a time waveform window *might not be periodic in each sampling window*.

Therefore, to preserve the magnitudes of the three sine waves in the Auto Spectrum, a **Flat Top** window will be applied to each sampling window before the **FFT** is used to calculate its **DFT**.

**Time Domain Window** → **Flat Top** is also listed in the dialog box above



*Auto Spectrum With a Flat Top Window Applied and 11 Spectrum Averages & Overlap Processing.*

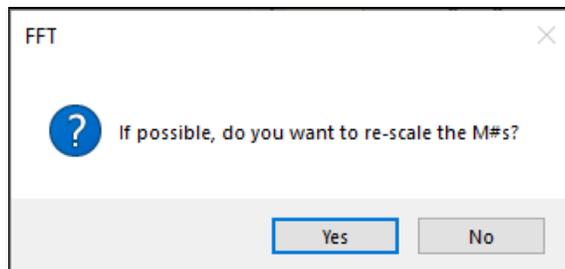
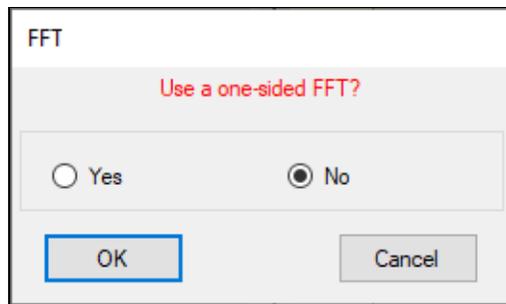
- **Press Calculate** in the **Transform | Spectra** dialog box
- Save the Auto Spectrum in **BLK: Auto Spectrum with Flat Top**

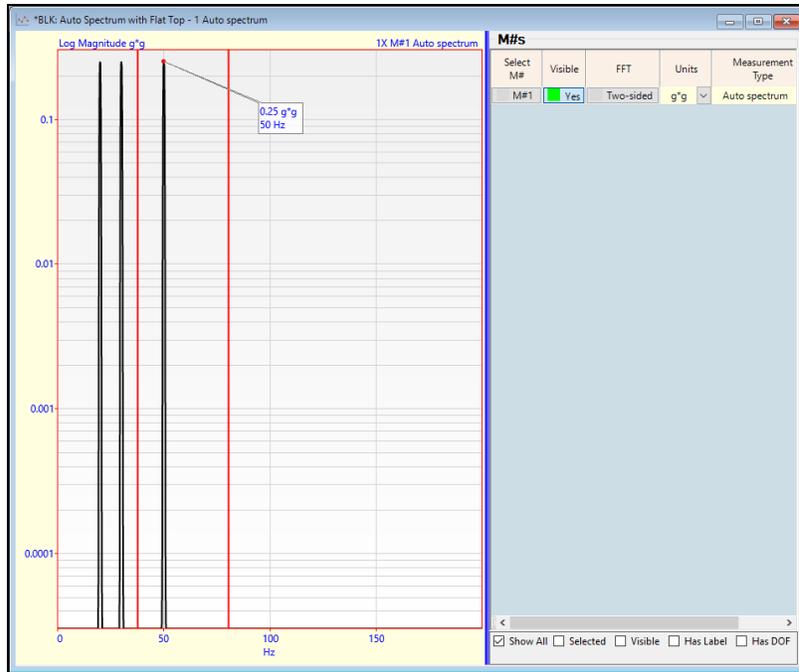
Because the Flat Top window was used, the three sine wave peaks appear at their respective frequencies (**20, 30, 50**) Hz, with magnitudes → "**1 g\*g**" in the Auto spectrum. However, compared to the Fourier spectrum, the sine wave peaks *now have "width" to them.*

**A Flat Top window *preserves peak magnitudes* but *increases peak widths*.**

**TWO-SIDED FFT**

- **Double click** on the **FFT** column in the **M#s** spreadsheet in Data Block **BLK: Auto Spectrum with Flat Top**
- In the dialog box that opens, choose **No**, **click** on **OK**
- Choose **Yes** in the next dialog box to **re-scale the data**





Auto Spectrum from Two-Sided FFT.

The magnitude of each spectrum peak in the Auto spectrum is now **0.25 g\*g** because half of the sine wave energy has been assigned to the *negative frequency peaks*.

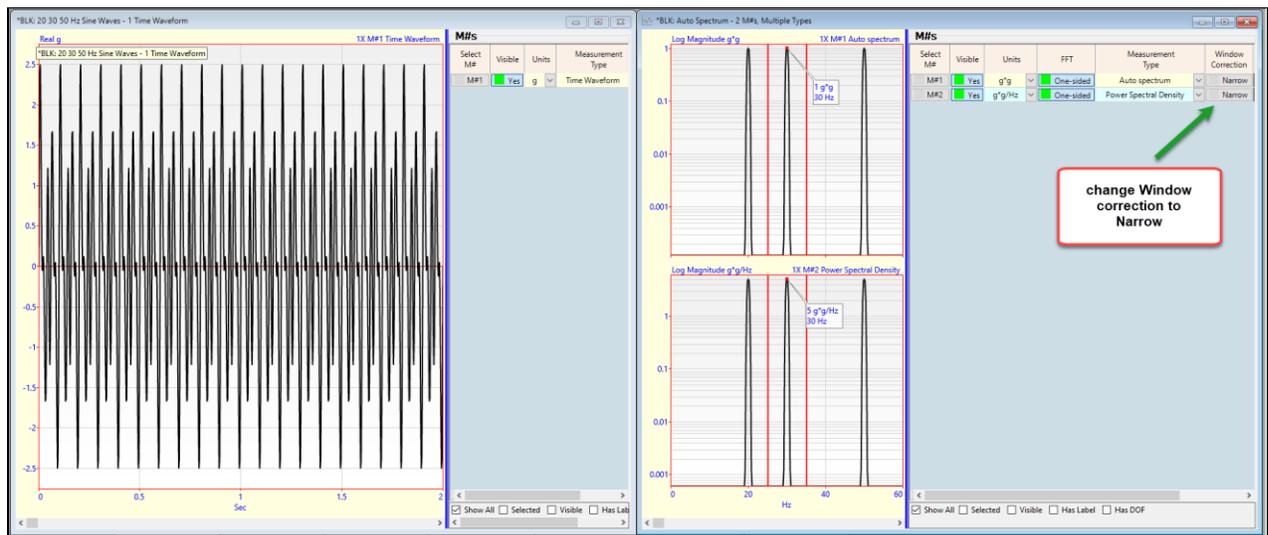
### STEP 3 - PSD USING A FLAT TOP WINDOW

- **Press Hotkey 3 PSD with Flat Top**

When **Hotkey 3 is pressed**, the same sinusoidal signal that was used to calculate the Auto spectrum will now be used to calculate a **PSD** and add it to the **BLK: Auto Spectrum with Flat Top Data Block**.

Two Data Block windows will open. The Data Block *on the left* shows the same time waveform with **20,000 samples** of sinusoidal time waveform data in it.

The Data Block *on the right* shows both the **Auto spectrum & PSD** of the waveform on the left, with three peaks at **(20, 30, 50) Hz**.



Auto spectrum and PSD of the Sinusoidal Waveform.

The **Peak cursor** in the Auto spectrum shows a magnitude of **1 g\*g** for the **30 Hz** sine wave

The units of the **PSD** are (**g\*g/Hz**) which is a *power* (mean squared) quantity.

In the **Window Correction** column of **BLK: Auto Spectrum with Flat Top**, choose **Narrow** for **M# 2**

Answer **Yes** in the dialog that opens to rescale the **PSD**

The **Peak cursor** in the PDS now shows a magnitude of **5 g\*g/Hz** for the **30 Hz** sine wave

The magnitudes of the three sine waves are **1 g** of the original time waveform. Therefore, the three Auto spectrum peaks have magnitude  $\rightarrow$  **1 g\*g**.

A **PSD** is an Auto spectrum "*normalized by*" (divided by) the **frequency resolution ( $\Delta f$ )** of the spectrum.

- Execute **File | Properties** in the **BLK: Auto Spectrum with Flat Top** window  
**Frequency Resolution  $\rightarrow$  0.2 Hz**

Therefore, the **PSD** peaks should be **5 (g\*g/Hz)**, which is confirmed by the cursor value on the **PSD (M#2)** in the Data Block window shown above.

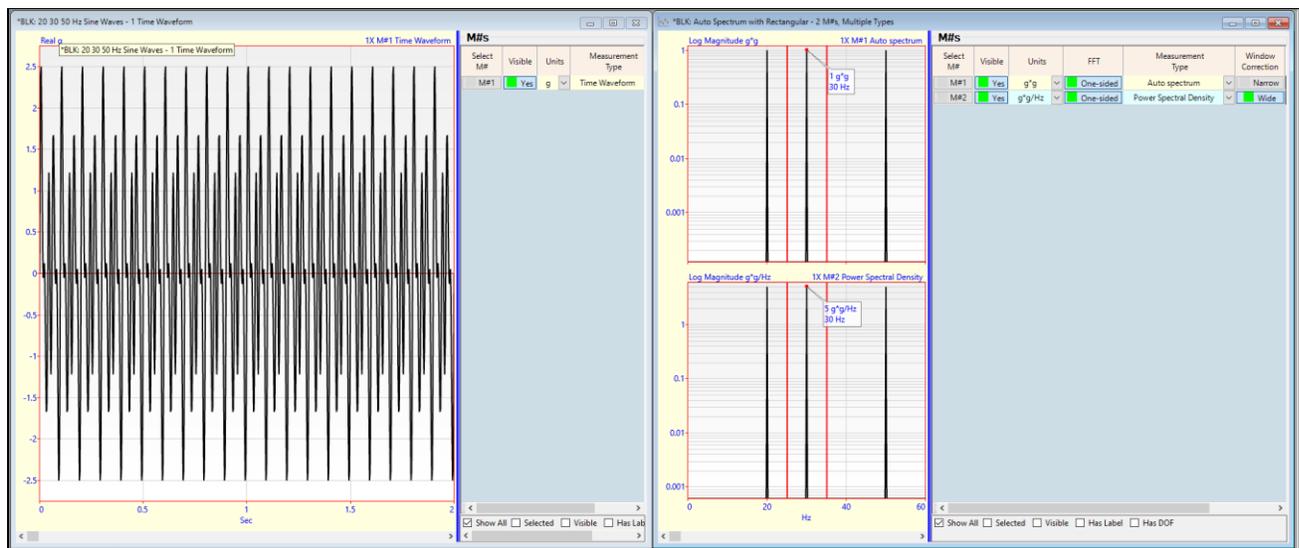
#### STEP 4 - SPECTRUM AVERAGING USING A RECTANGULAR WINDOW

- Press **Hotkey 4 Auto Spectrum with Rectangular**

When **Hotkey 4** is *pressed*, the same sinusoidal signal that was used to calculate the Auto spectrum will now be used to calculate a **PSD** and add it to the **BLK: Auto Spectrum with Flat Top** Data Block.

Two Data Block windows will open. The Data Block *on the left* shows the same time waveform with **20,000 samples** of sinusoidal time waveform data in it.

The Data Block *on the right* again shows both the **Auto spectrum & PSD** of the time waveform *on the left*, with three peaks at **(20, 30, 50) Hz**.



*Auto spectrum & PSD of a Periodic Signal Using a Rectangular Window.*

The narrow peaks at the three frequencies at **(20, 30, 50) Hz** in both the **Auto spectrum & PSD** verify that the time waveform remained *periodic in each sampling window* when **11 averages** were calculated with **10% overlap processing**.

## CONCLUSION

In **Steps 2 & 3**, a **Flat Top** window was applied to the time waveforms in each sampling window to obtain *accurate magnitudes* in each spectral estimate. An Auto spectrum and **PSD** were calculated from the time waveform in **BLK: 20 30 50 Hz Sine Waves** using the following parameters

**Spectrum Block Size** → 1000 samples

**Number of Averages** → 11

**Overlap processing** → 10%

**Time Domain Window** → Flat Top

The time waveform in **BLK: 20 30 50 Hz Sine Waves** contains **20000 samples** over a time of **T** → **50 seconds**.

With a **Spectrum Block Size** → 1000 samples, each time domain *sampling window contains 2000 samples* over a time of **T** → **5 seconds**.

With these sampling parameters, each sinusoidal waveform *is still periodic in its sampling window*.

- The three sine waves *complete exactly 100 (20 Hz), 150 (30 Hz), 250 (50 Hz) cycles* in **T** → **5 seconds**
- With overlap processing, the next sampling window starts after **10 (20 Hz), 15 (30 Hz), 25 (50 Hz) cycles** of each sine wave
- *No leakage* will occur in the calculated **DFT**, and therefore the **Auto spectrum & PSD have no leakage**

Because each sinusoidal waveform *is periodic in its sampling window* a **Rectangular** window can also be used instead of a **Flat Top** window.

## STEP 5 - REVIEW STEPS

To review the steps of this App Note,

- **Press Hotkey 5 Review Steps**