

## Fourier transformation

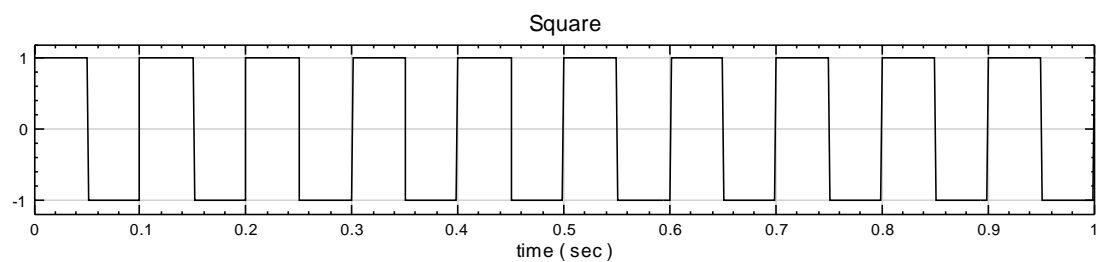
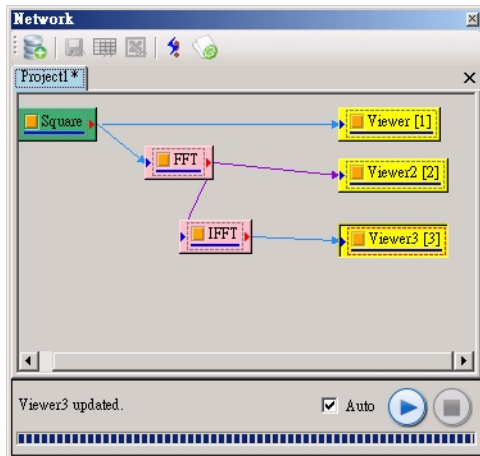
For the periodic boundary, one could decompose a signal  $f(t)$  into a set of linear combination of sine and cosine waves :

$$f(t) = \sum_{n=0}^{\infty} A_n \cos\left(n \frac{2\pi}{T} t\right) + B_n \sin\left(n \frac{2\pi}{T} t\right) \quad \text{it is the Fourier series.}$$

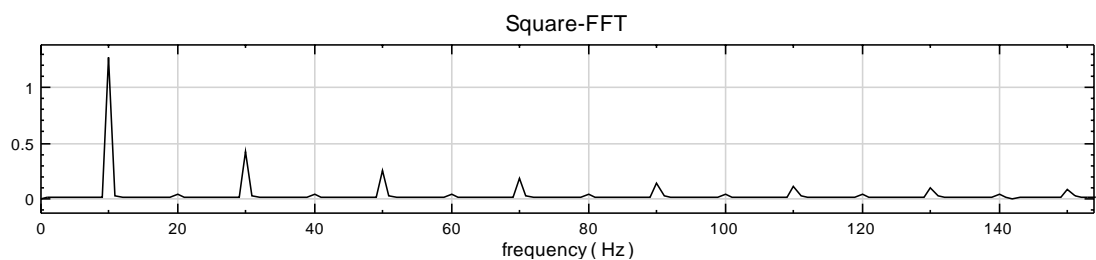
If the boundary be infinity, the  $\sum$  is evolution to  $\int$  and combining the sine and cosine with Euler formula ( $e^{ix} = \cos x + i \cdot \sin x$ ), that is Fourier transformation. The Fourier transformation is the right tool for non-periodic functions:

$$F(\omega) = F[f(t)] = \int_{-\infty}^{\infty} f(t) e^{i\omega t} dt, \quad \text{the inverse be } f(t) = \frac{1}{2\pi} \int_{-\infty}^{\infty} F(\omega) e^{-i\omega t} d\omega$$

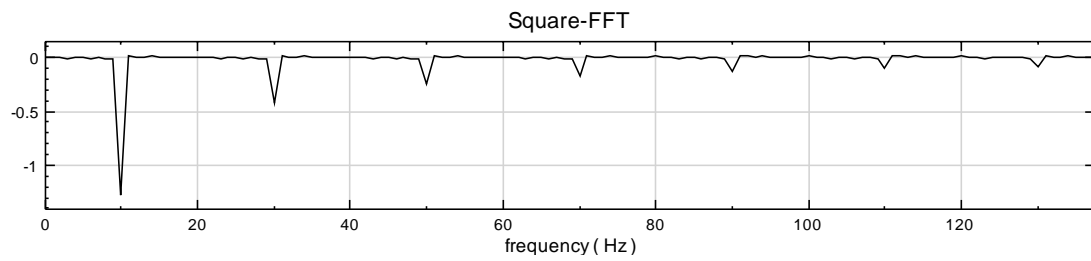
For example, the Square wave:



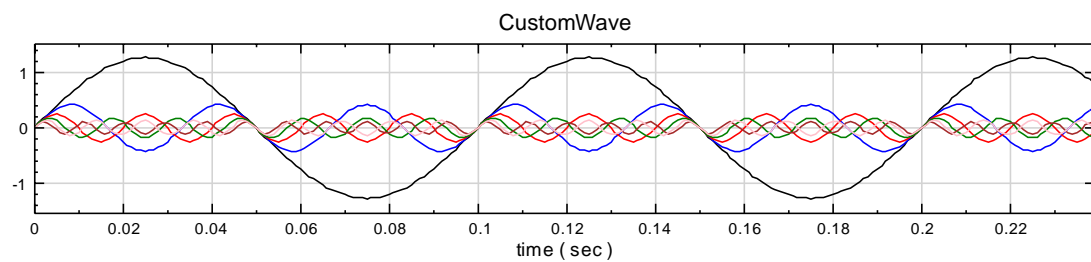
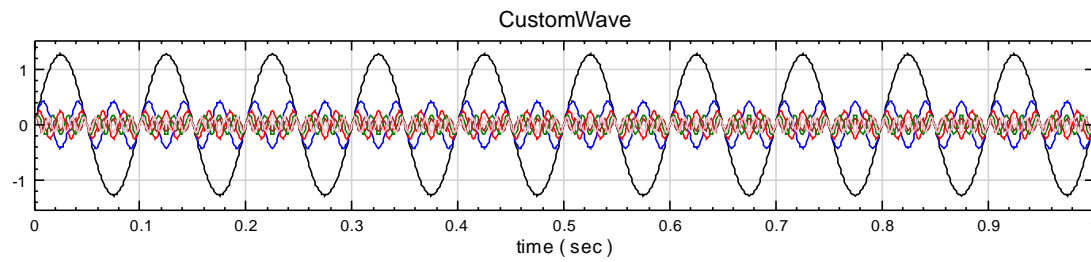
After Fourier transformation, the magnitude being:



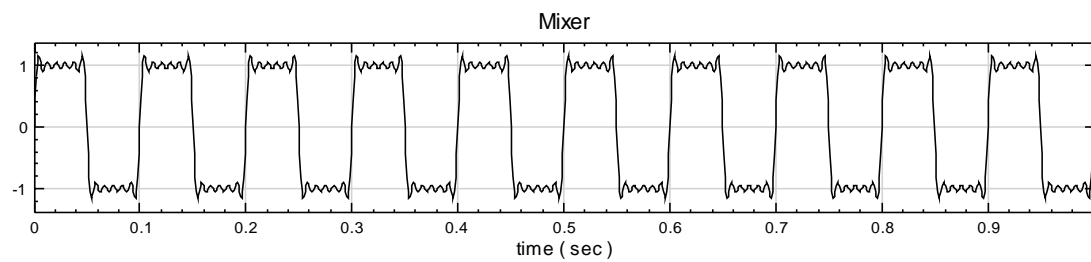
The imag part be :



So the square wave could be decomposed into those sine /cosine wave by the Fourier result :

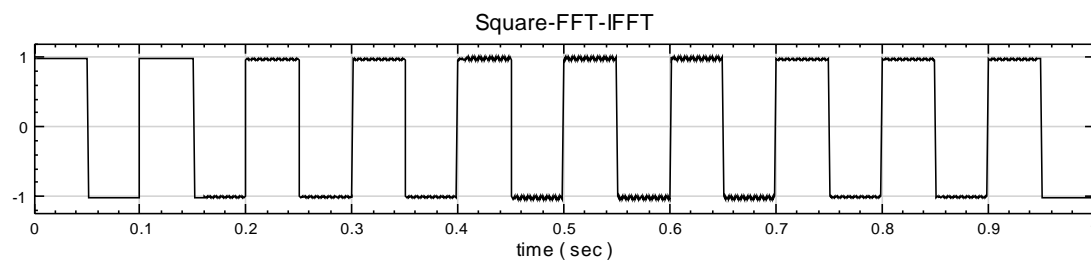


If we combine those wave by first 6 terms, the plot be :



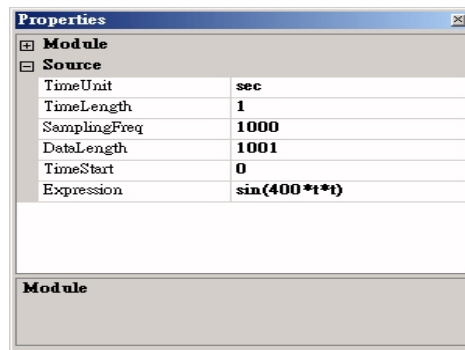
It is Fourier inverse transformation.

( The Inversing result takes by Visual Signal directly as there are about 30 terms-combination:

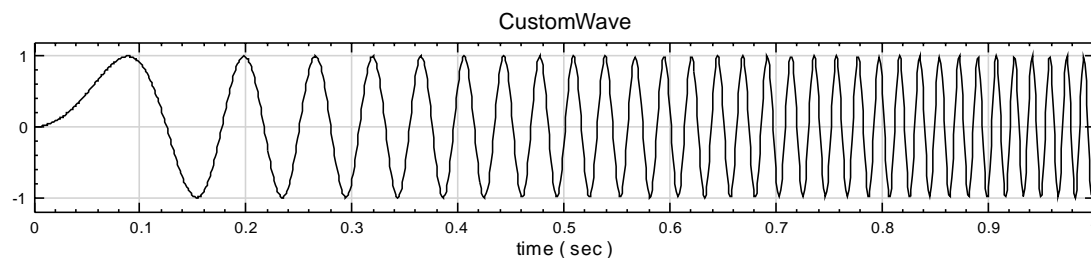


Take care the Gibbs phenomina )

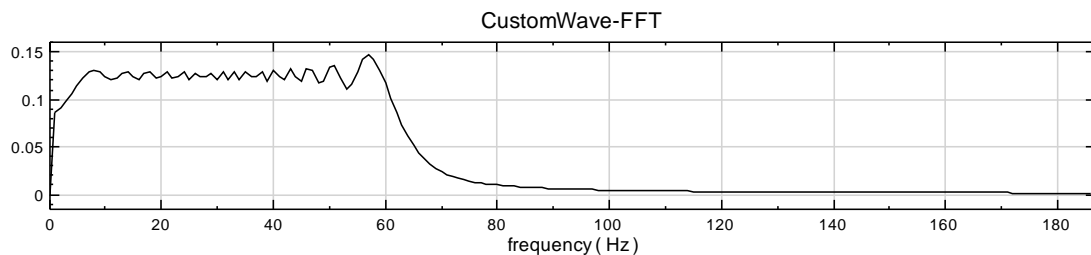
But the Fourier transformation is just good for **stationary** signal, but bad for general signal, i.e:  $f(\omega(t))$ . The simplest case is a signal being  $f(t) = \sin(\omega(t) \cdot t)$ ,  $\omega(t) = a \cdot t$ :



Custom wave set as:



its Fourier transformation :



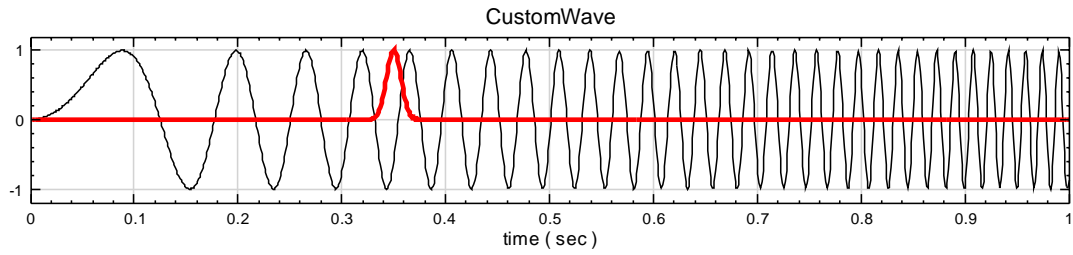
That does not represent the  $\omega$  be proportion to  $t$  intuitively.

### Short-Term Fourier

If we multiply the signal by a retard Gaussian  $g(t - \tau) = \left(\frac{1}{\pi\sigma}\right)^{\frac{1}{2}} e^{-\frac{(t-\tau)^2}{\sigma}}$ , ( $\tau$  is the retard time,  $\sigma$  is the frequency resolution), then we get the short-term Fourier:

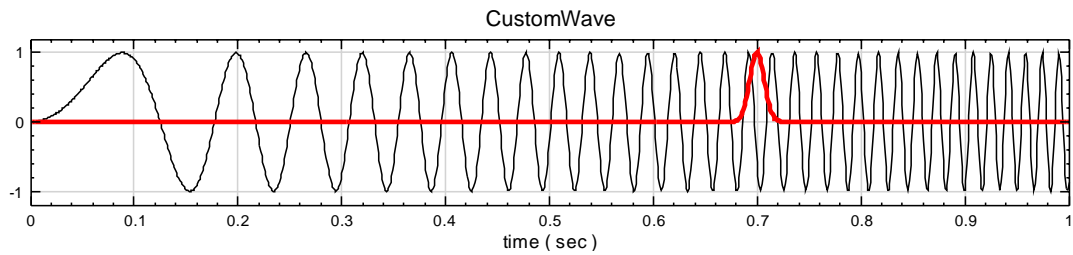
$$SF(\tau, \omega) = \int_{-\infty}^{\infty} f(t) \cdot \left(\frac{1}{\pi\sigma}\right)^{\frac{1}{2}} e^{-\frac{(t-\tau)^2}{\sigma}} \cdot e^{i\omega t} dt$$

It means that, there is Gaussian “detector” in time  $\tau$  to measure the signal. :

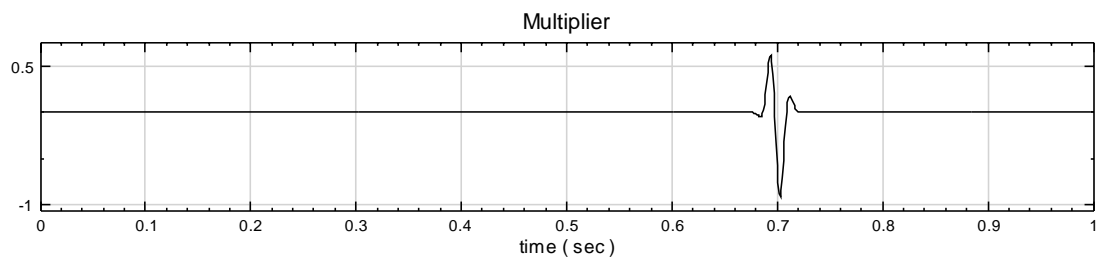


If we measure the signal by the Gaussian function at different  $\tau$ , result is a function of measuring time and frequency (i.e. angular velocity). It is what axis of the time-frequency plot are time and frequency.

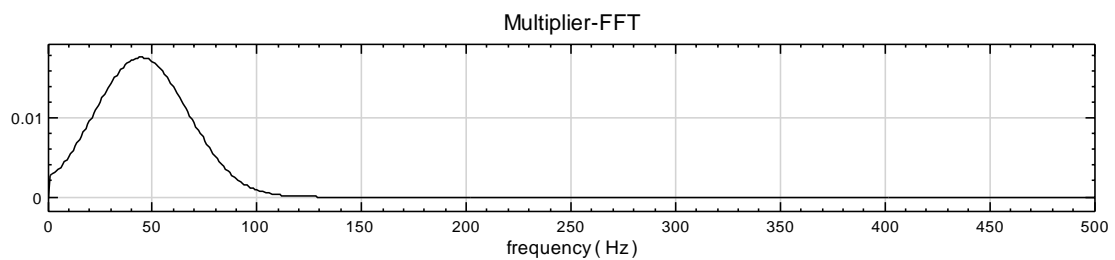
if the “detector” in time  $t'$ , the step to find  $SF(\tau, \omega)|_{t=\tau}$ , The step is :



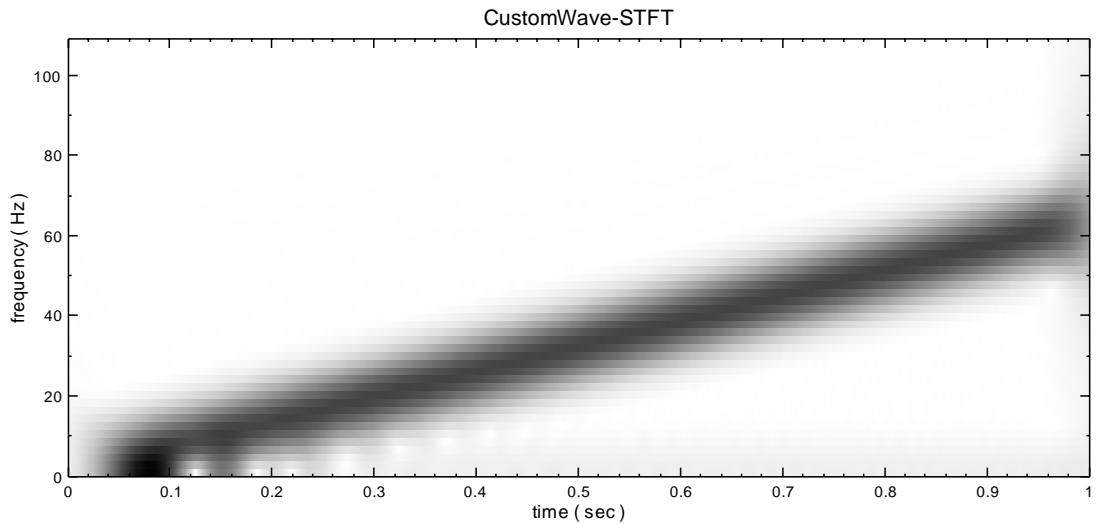
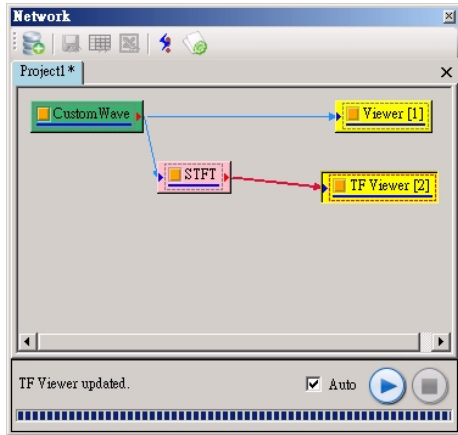
Multiplying the detector by original signal :



Fouriering it:



After above step for all time points, we could plot the  $SF(\omega, \tau)$  :



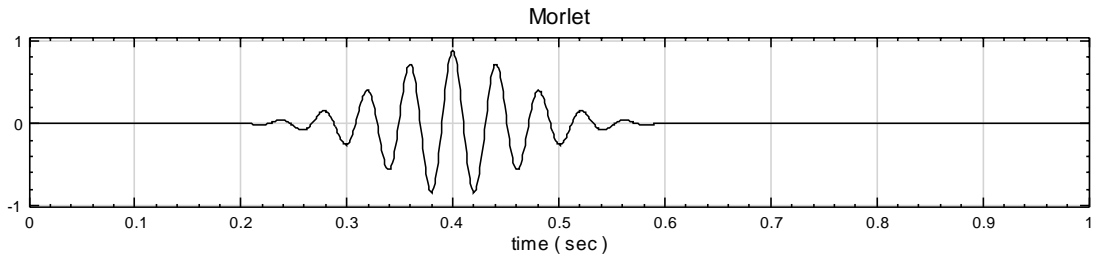
### Wavelet transformation

Similar spirit, replace the gaussian multiply Fourier kernel( $e^{i\omega t}$ ) term to wavelet

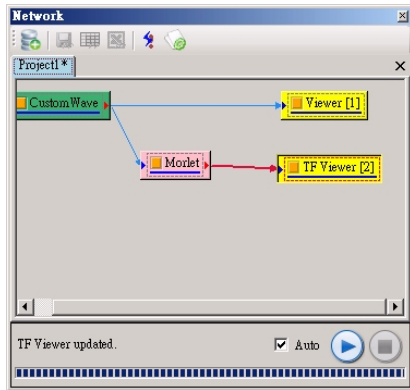
kernel function  $\phi_{a,\tau}(t) = \frac{1}{(a)^{\frac{1}{2}}} \cdot \phi\left(\frac{t-\tau}{a}\right)$ , ( $\int_{\mathbb{R}} \phi(t) dt = 1$  and  $a$  is the scale factor,

$\frac{1}{a} \equiv \text{frequency}$ ), that is wavelet transformation:

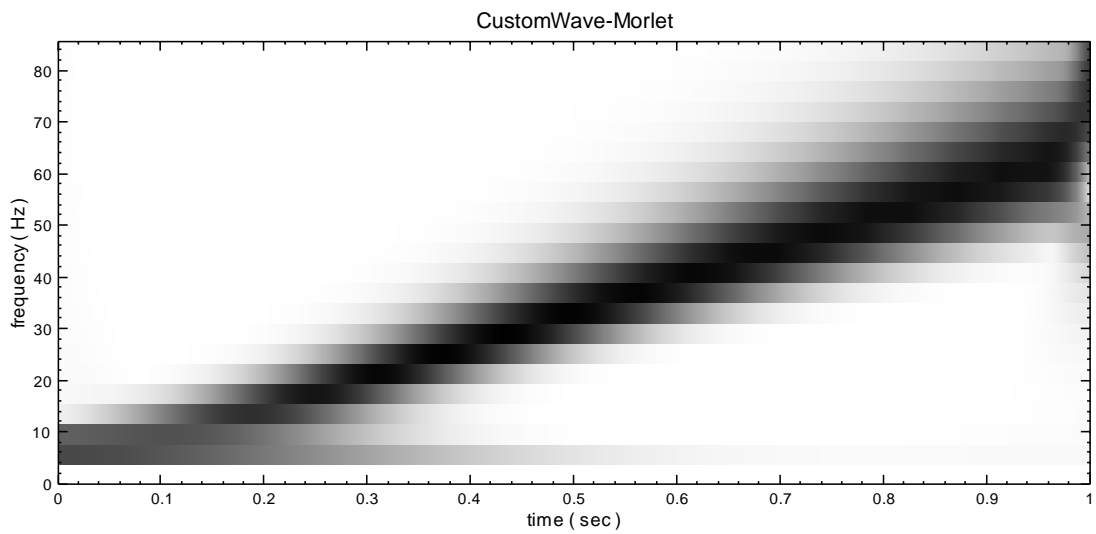
$WT(a, \tau) = \int_{-\infty}^{\infty} \frac{1}{(a)^{\frac{1}{2}}} \cdot \phi^*\left(\frac{t-\tau}{a}\right) \cdot f(t) dt$  .(for example, the Morlet kernel is



)

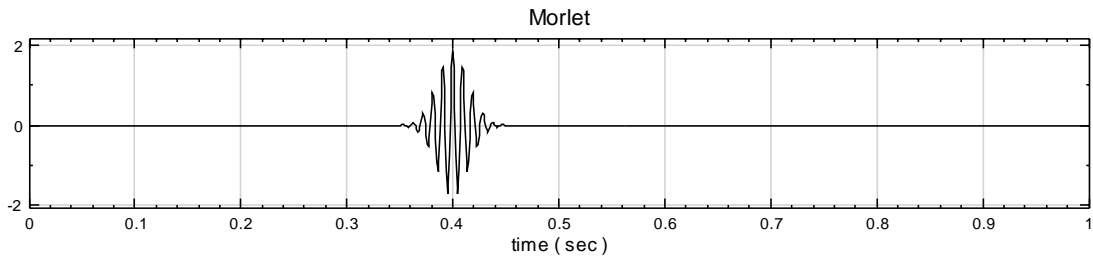


Wavelet transformation being:

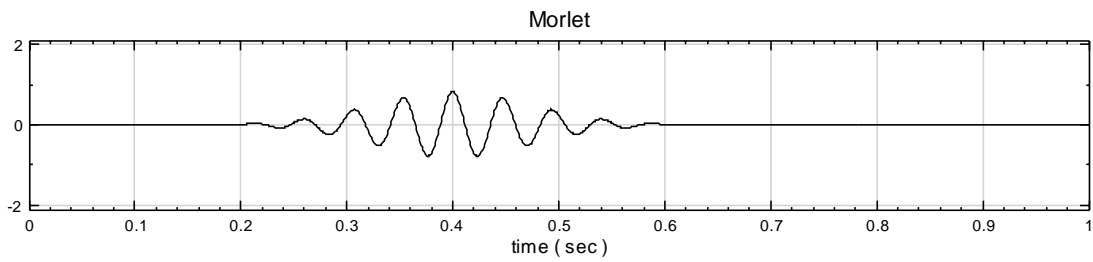


Noticing that the wavelet kernel function shape changes with frequency :

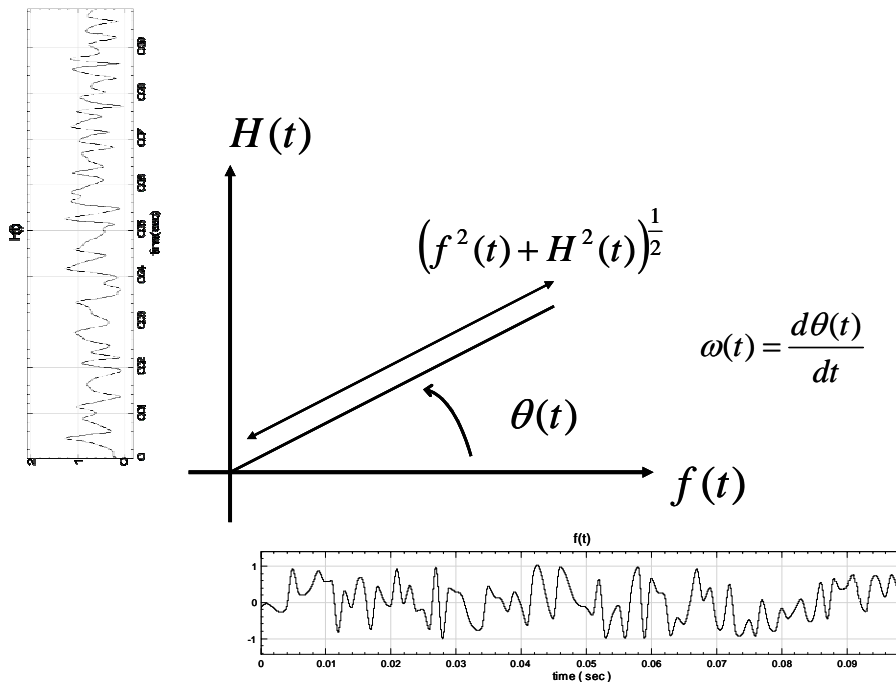
high frequency:



Low frequency



### Hilbert transformation



Let original signal be  $f(t)$ , its Hilbert transformation is  $H(t)$ , called Hilbert pair.

In mathematical expression,  $H(t) = P.V. \frac{1}{\pi} \int_{-\infty}^{\infty} f(t') \left( \frac{1}{t' - \tau} \right) dt' \Big|_{t=\tau}$  (or written as the

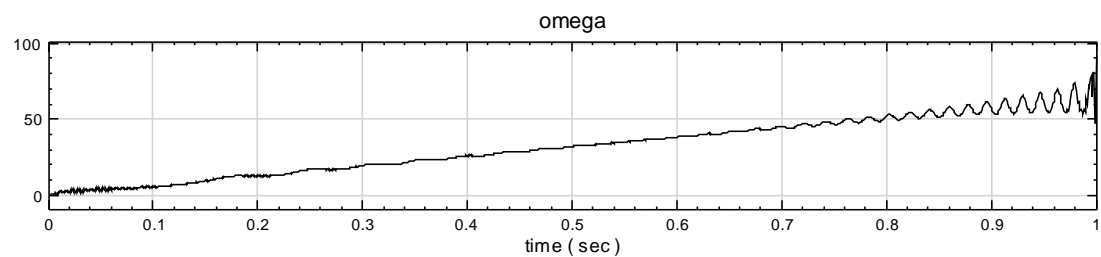
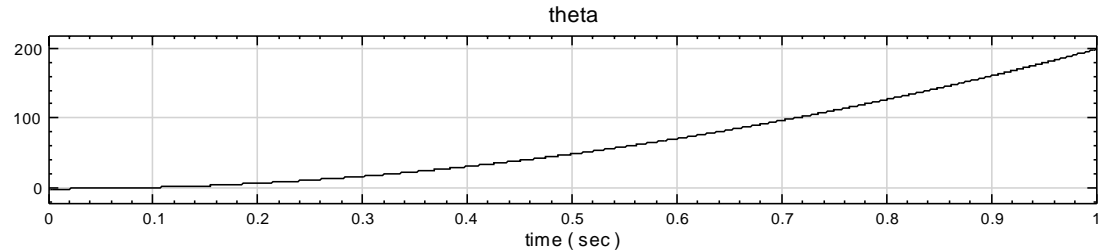
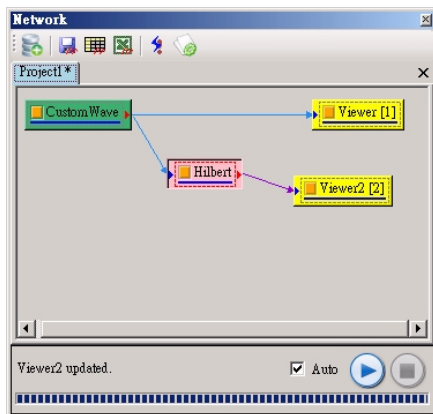
convolution form  $H(t) = f(t) * \left( \frac{1}{t \cdot \pi} \right)$

Let  $Z(t) = f(t) + iH(t)$ , also  $Z(t)$  could represent as polar coordinates:

$$Z(t) = a(t) \cdot e^{i\theta(t)}, \quad a(t) = \left( f(t)^2 + H(t)^2 \right)^{\frac{1}{2}}, \quad \theta(t) = \tan^{-1} \left( \frac{H(t)}{f(t)} \right)$$

The frequency  $\omega(t) \equiv \frac{d\theta(t)}{dt}$

We could calculate the phase  $\theta(t)$  first to evolve the  $\omega(t)$ .





writing  $Z(t) \rightarrow Z(t, \omega)$ ,  $\text{Re}(Z(t, \omega)) = f(t, \omega)$ ,  $\text{Im}(Z(t, \omega)) = H(t, \omega)$ . And finding the  $a(t, \omega) = \left(f(t, \omega)^2 + H(t, \omega)^2\right)^{\frac{1}{2}}$ , that is Hilbert Spectrum.

