

# Sony VAIO Logo



The Sony VAIO logo illustrates the integration of analog and digital technology. The VA letters form an analog wave and the IO part represents a binary one and zero.

# Principles of Communications

## ECS 332

**Dr. Prapun Suksompong**

[prapun@siit.tu.ac.th](mailto:prapun@siit.tu.ac.th)

## 8. Sampling and Aliasing



**Office Hours:**

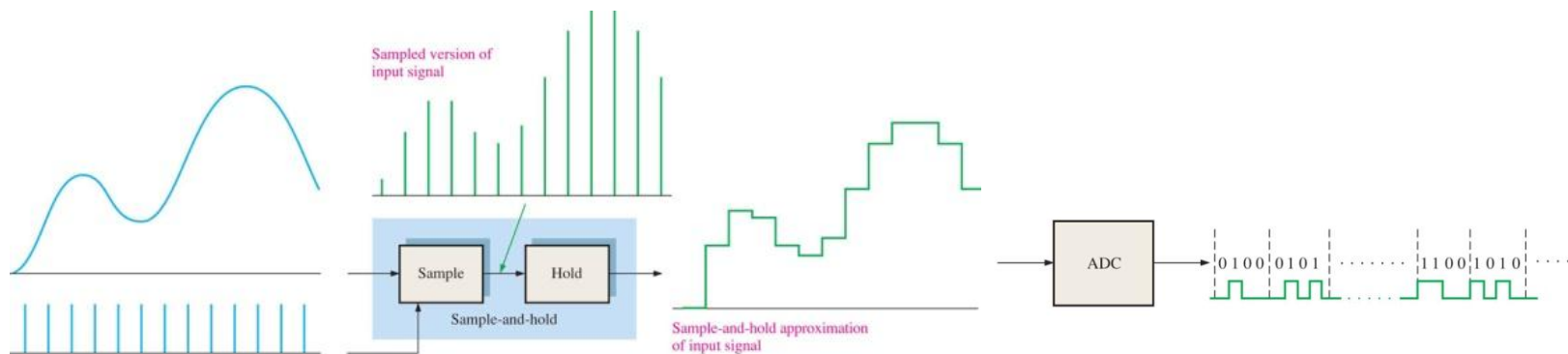
**BKD 3601-7**

**Monday 14:40-16:00**

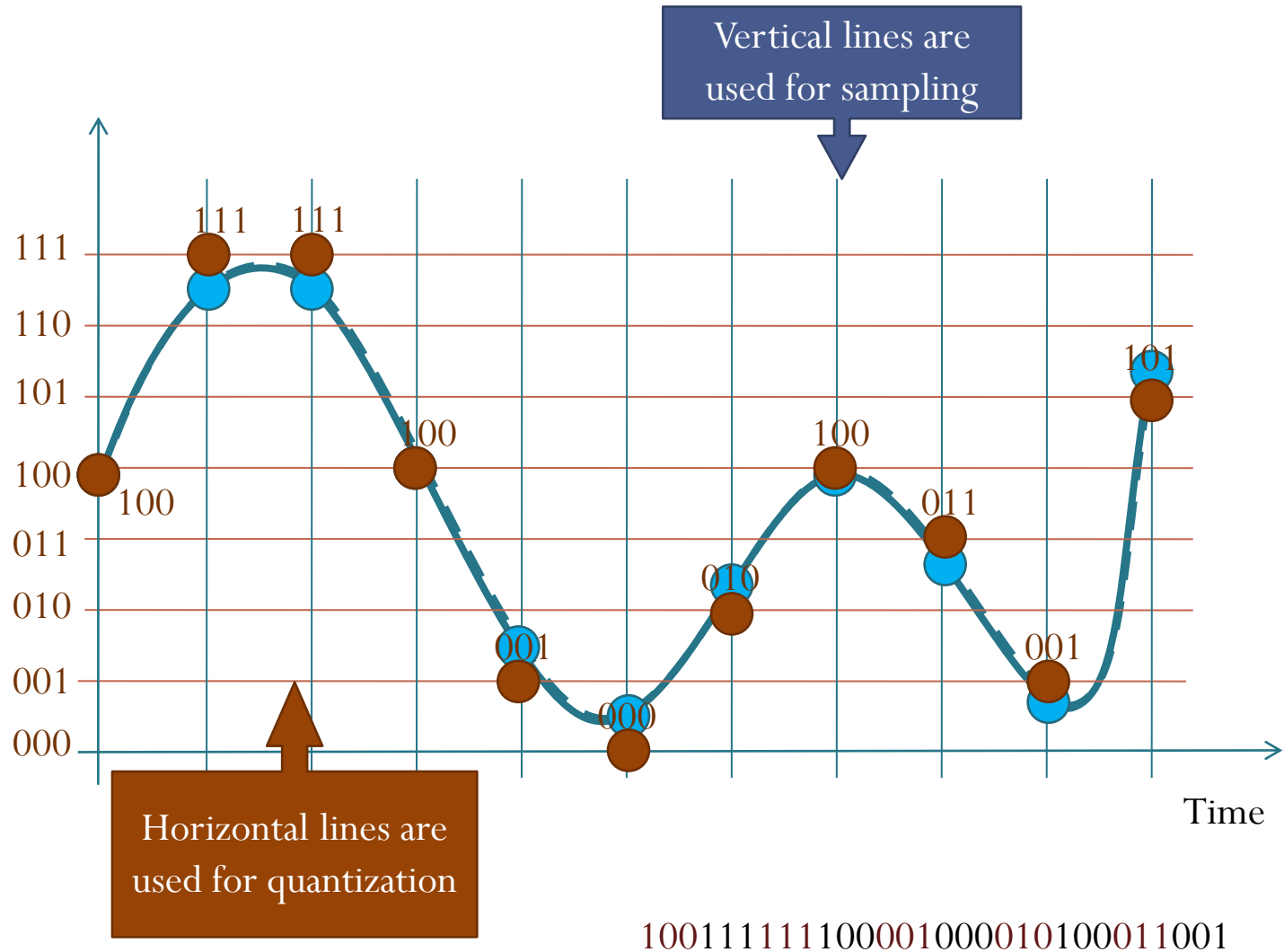
**Friday 14:00-16:00**

# Converting Analog Signals to Digital

- The real world is analog!
- Interfacing between analog and digital is important.
- Digitization
  1. **Sampling (and hold)**: Discretize the time
    - Get sampled values of the analog signal.
  2. **Quantization**: Discretize quantity values
    - Convert each sampled value to a binary code.



# Digitization (analog to digital)



# Sampling = loss of information?

- At first glance, digitization of a continuous signal (audio, image) appears to be an enormous loss of information, because a continuous function is reduced to a function on a grid of points.
- Therefore the crucial question arises as to which criterion we can use to ensure that the sampled points are a valid representation of the continuous signal, i.e., there is no loss of information.

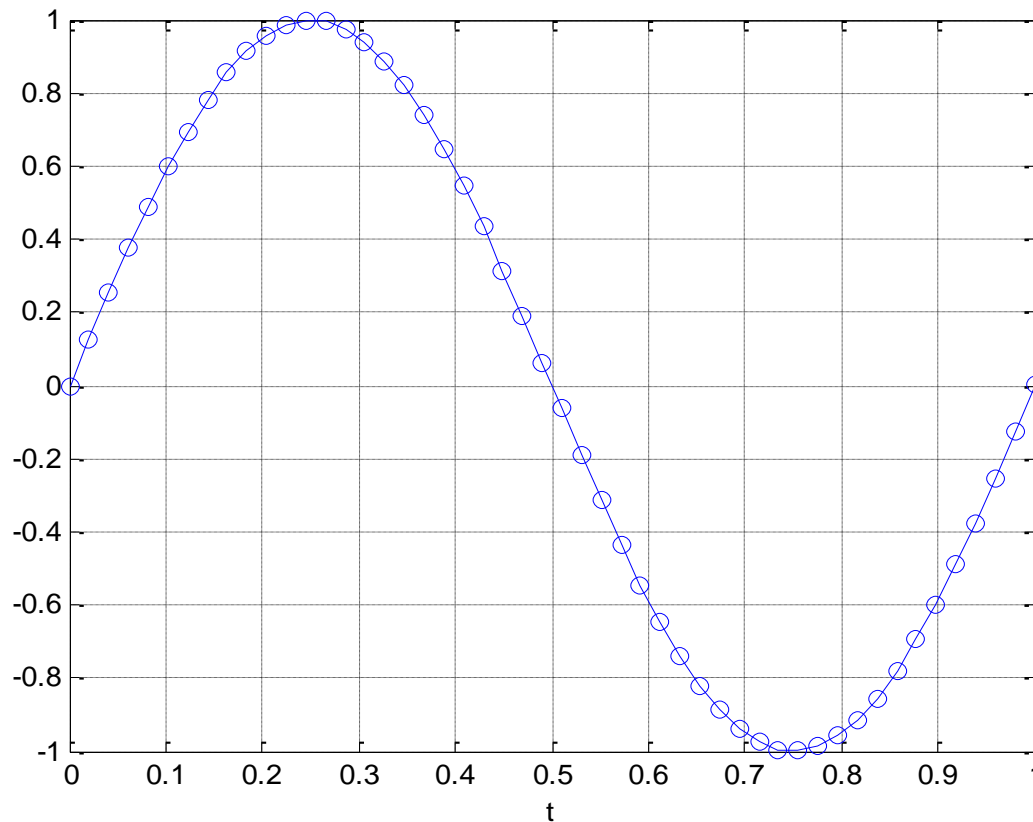
# Sampling

- **Sampling** is the process of taking a (sufficient) number of discrete values of points on a waveform that will define the shape of wave form.
- Suppose that we sample a signal at a uniform rate, once every  $T_s$  seconds.
  - We refer to  $T_s$  as the **sampling period**, and to its reciprocal  $f_s = 1/T_s$  as the **sampling rate**.
- The more samples you take, the more accurately you can define a waveform.
  - *Caution:* If the sampling rate is too low, you may experience distortion (**aliasing**).

# Example: $\sin(100\pi t)$

(1/4)

This is the plot of  $\sin(100\pi t)$ . What's wrong with it?



[AliasingSin\_2.m]

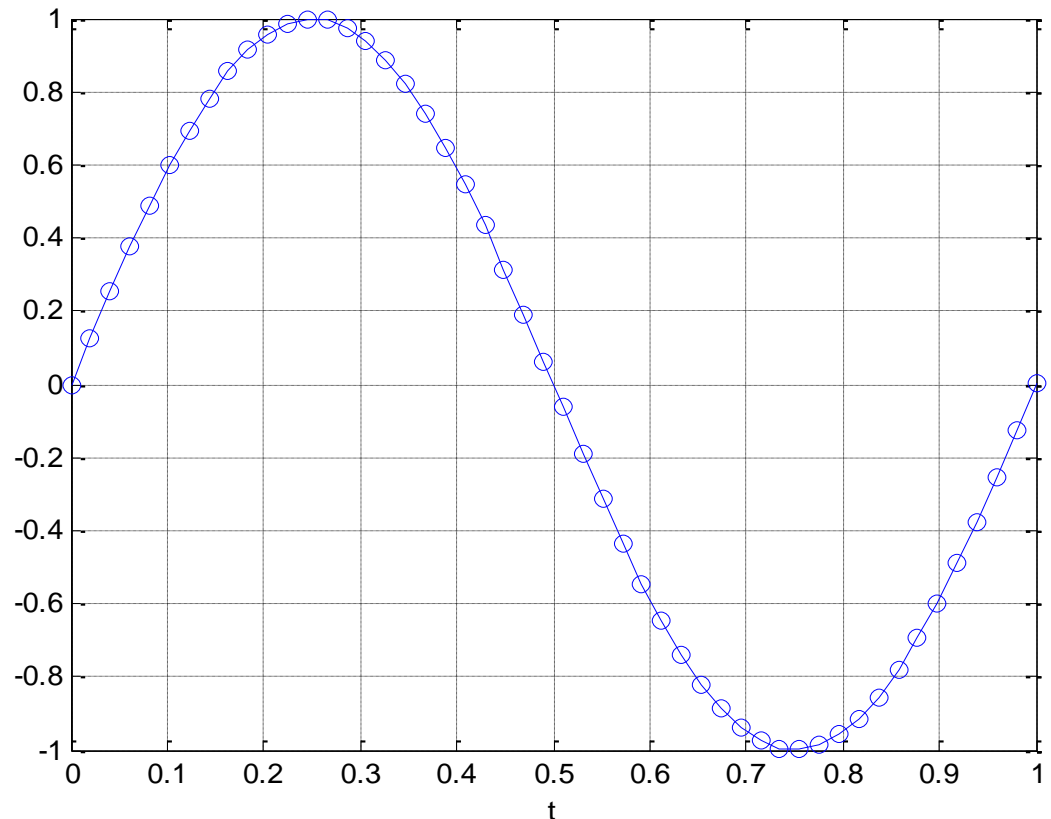
# Example: $\sin(100\pi t)$ (2/4)

Signal of the form  $\sin(2\pi f_0 t)$  have frequency  $f = f_0$  Hz.

So, the frequency of  $\sin(100\pi t)$  is 50 Hz.

From time 0 to 1, it should have completed 50 cycles. However, our plot has only one cycle.

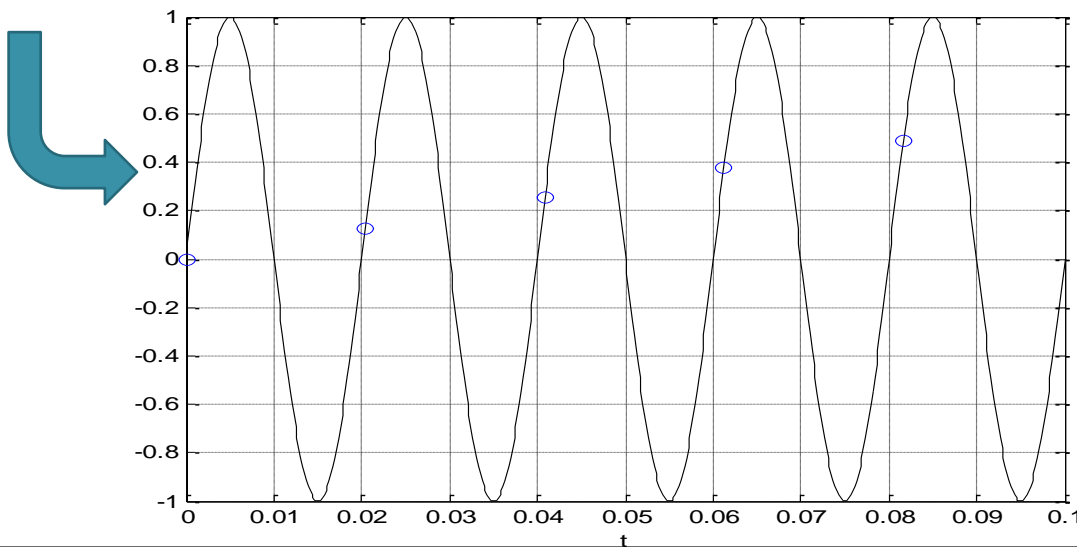
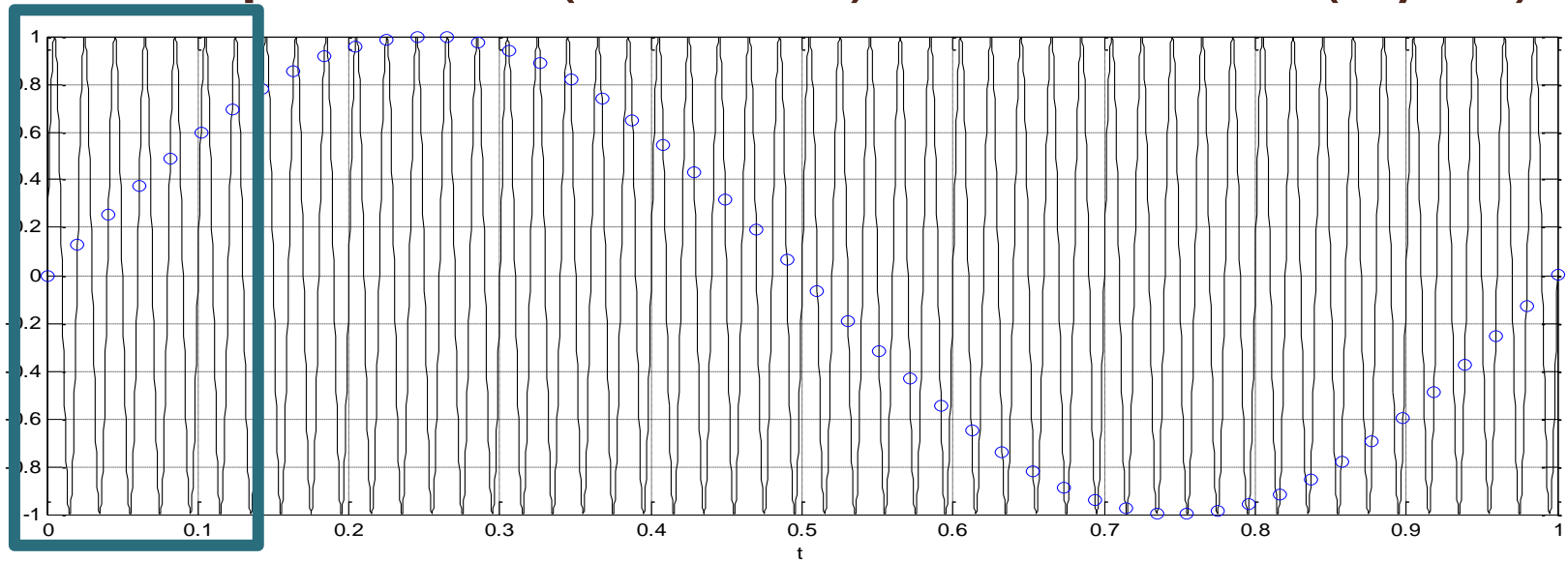
It looks more like the plot of  $\sin(2\pi t)$





# Example: $\sin(100\pi t)$

(3/4)



Aliasing causes high-frequency signal to be seen as low frequency.

# Sampling Theorem

- In order to (correctly and completely) represent an analog signal, **the sampling frequency,  $f_s$ , must be at least twice the highest frequency component of the analog signal.**
- Given a sampling frequency,  $f_s$ ,  
the **Nyquist frequency** is defined as  $f_s/2$ .
- Given that highest (positive-)frequency component  $f_{\max}$  of the analog signal,  
the **Nyquist sampling rate** is  $2f_{\max}$   
And the **Nyquist sampling interval** is  $1/(2f_{\max})$

# Example: $\sin(100\pi t)$

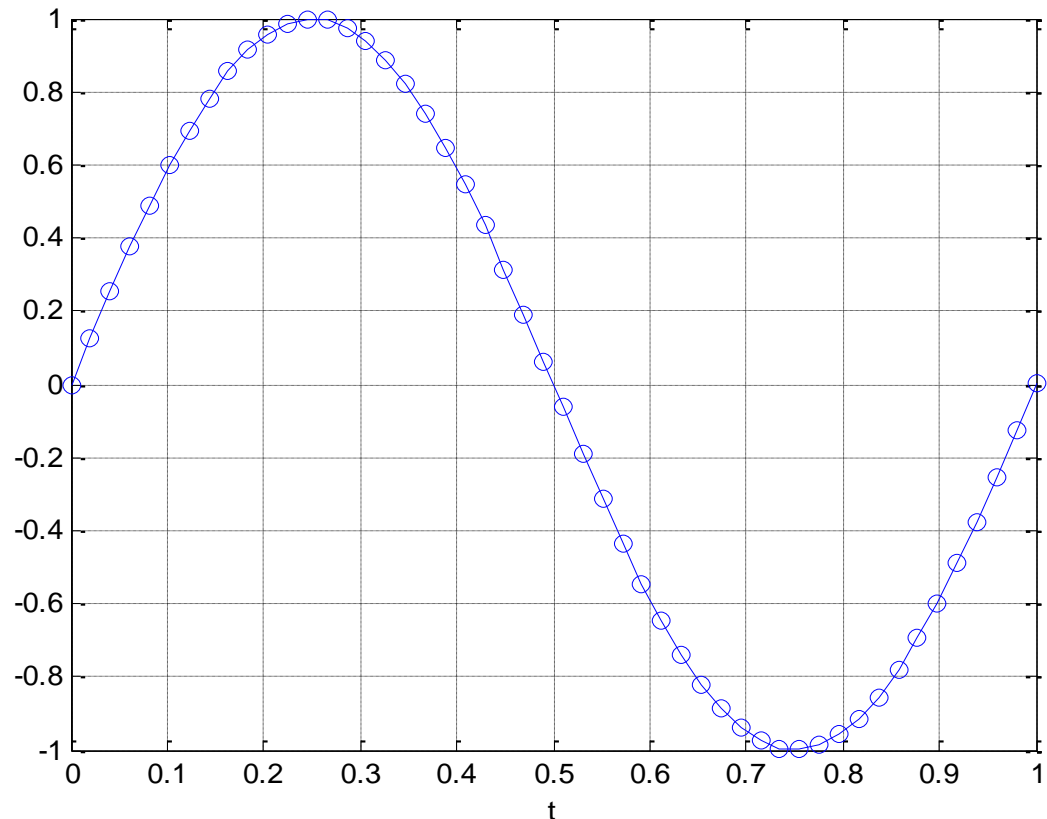
(4/4)

Signal of the form  $\sin(2\pi f_0 t)$  have frequency  $f = f_0$  Hz.

So, the frequency of  $\sin(100\pi t)$  is 50 Hz.

We need to sample at least 100 times per time unit.

Here, the number of sample per time unit is 49, which is too small to avoid aliasing.



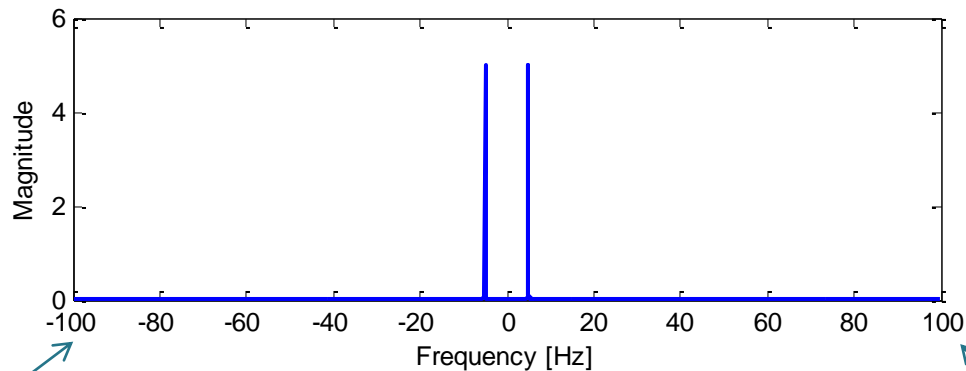
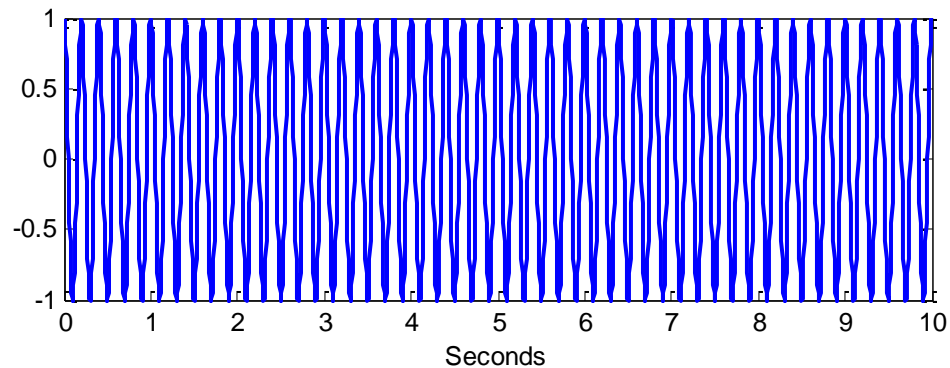
# Ex: Aliasing

- If you've ever watched a film and seen the wheel of a rolling wagon appear to be going backwards, you've witnessed *aliasing*.

# plotspec.m

- $f_s$ : Sampling frequency = 200 samples/sec

$\cos(2\pi(5)t)$



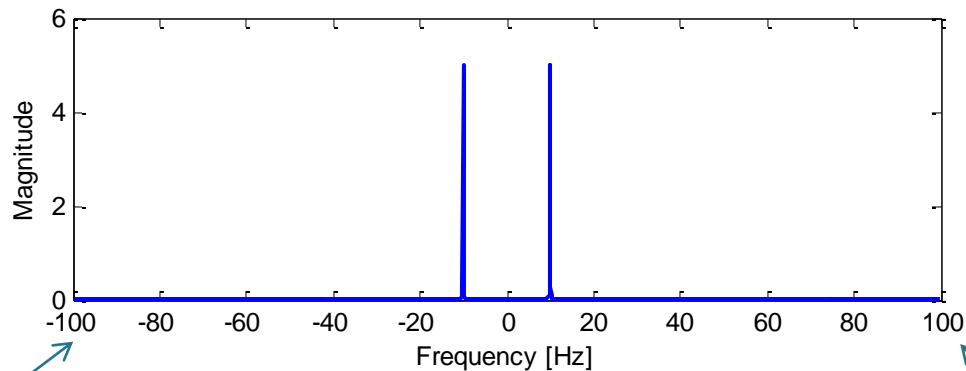
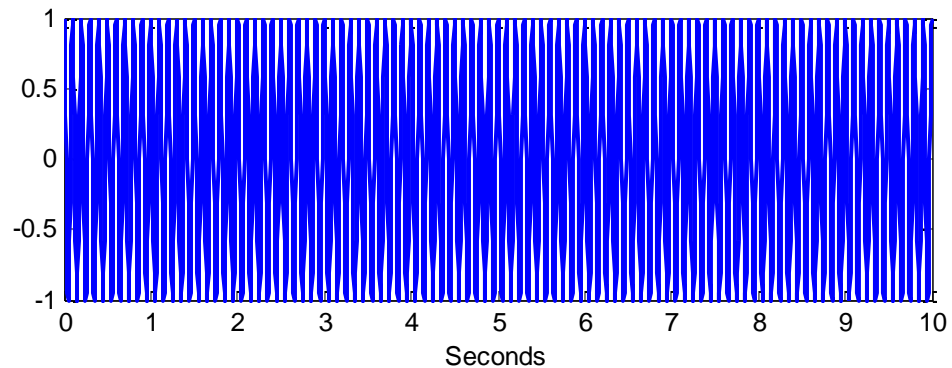
$$-\frac{f_s}{2}$$

$$\frac{f_s}{2}$$

# plotspec.m

- $f_s$ : Sampling frequency = 200 samples/sec

$$\cos(2\pi(10)t)$$



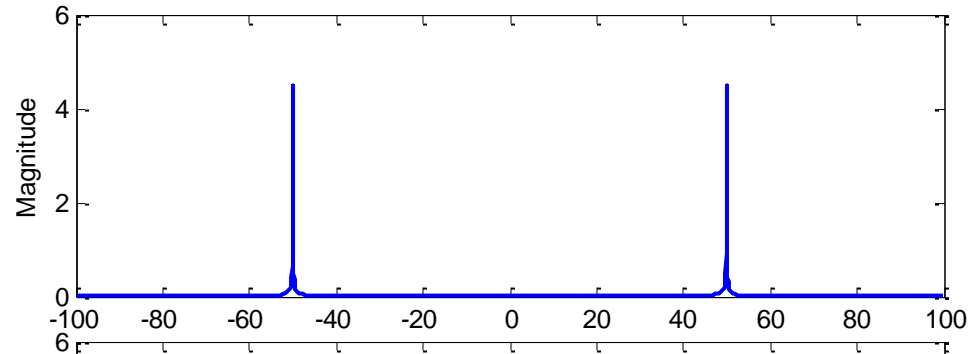
$$-\frac{f_s}{2}$$

$$\frac{f_s}{2}$$

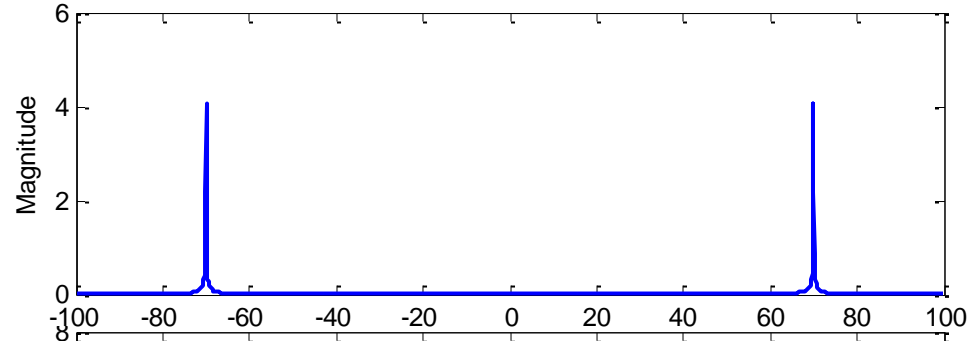
# plotspec.m

- $f_s$ : Sampling frequency = 200 samples/sec

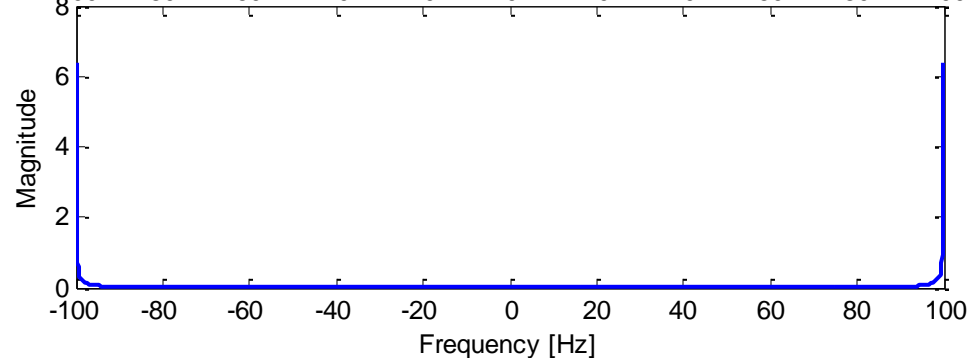
$$\cos(2\pi(50)t)$$



$$\cos(2\pi(70)t)$$



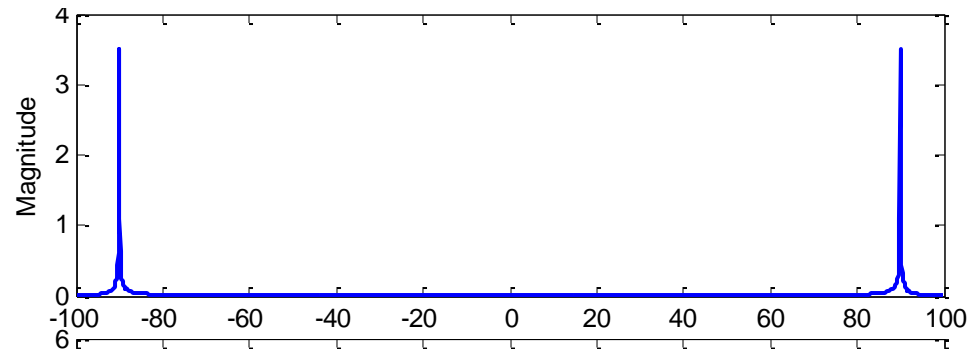
$$\cos(2\pi(100)t)$$



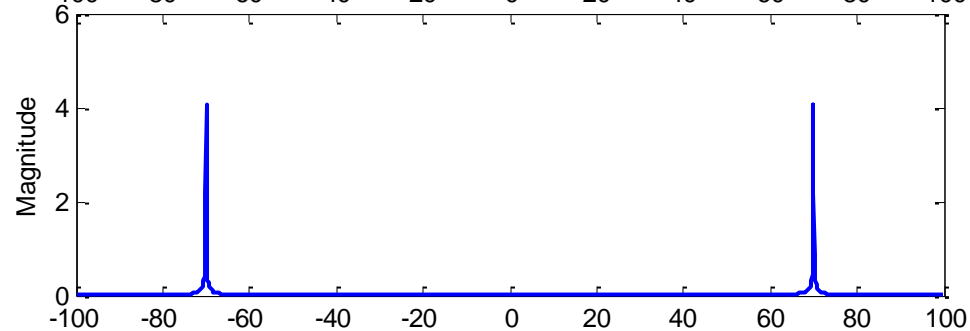
# plotspec.m

- $f_s$ : Sampling frequency = 200 samples/sec

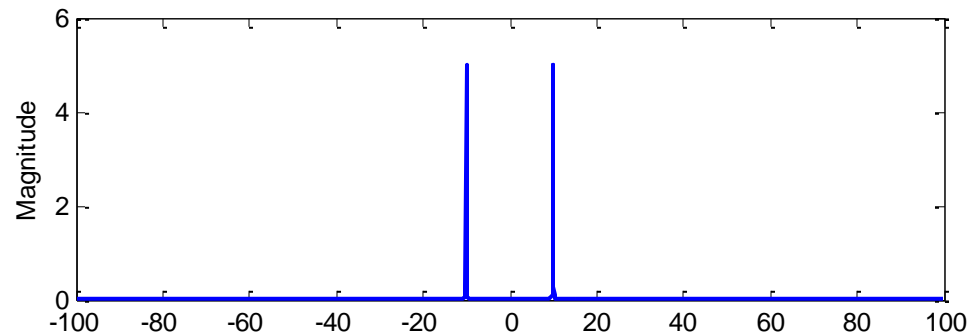
$$\cos(2\pi(110)t)$$



$$\cos(2\pi(130)t)$$



$$\cos(2\pi(190)t)$$



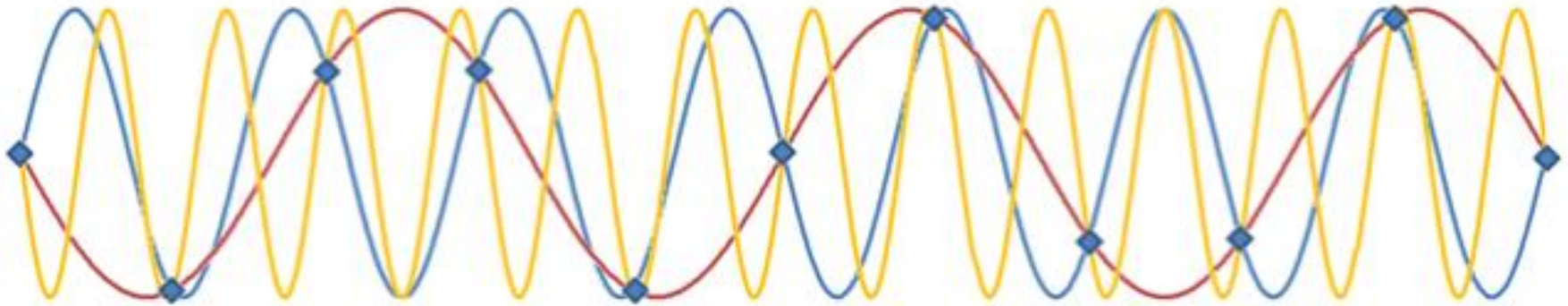


# Pac Man



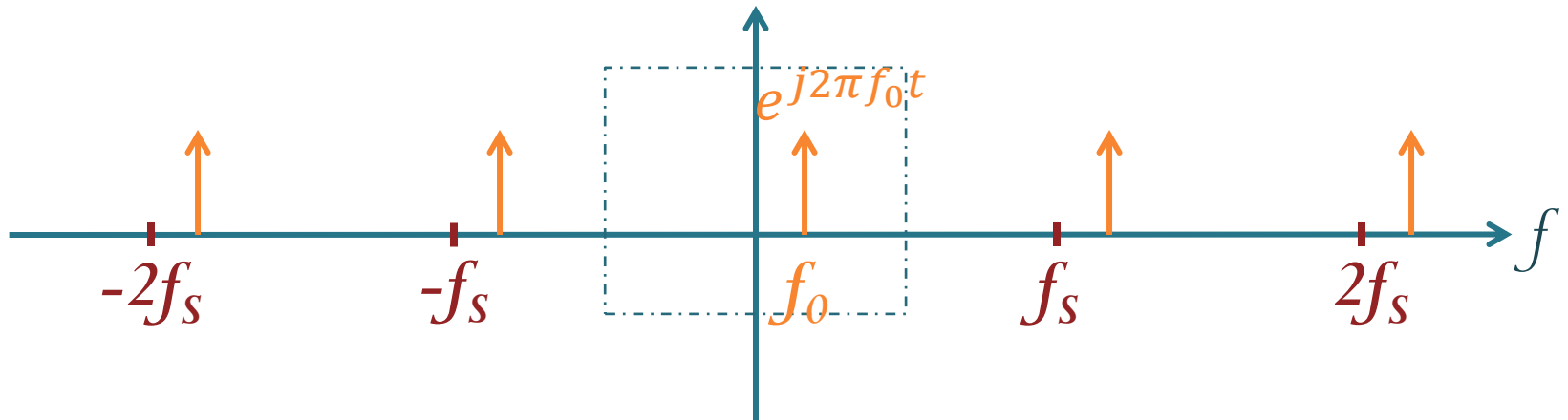
# Another Example

- When sampled at 10 Samples per sec, there is no way to tell the difference between 3Hz, 7Hz, or the 13Hz waves below.

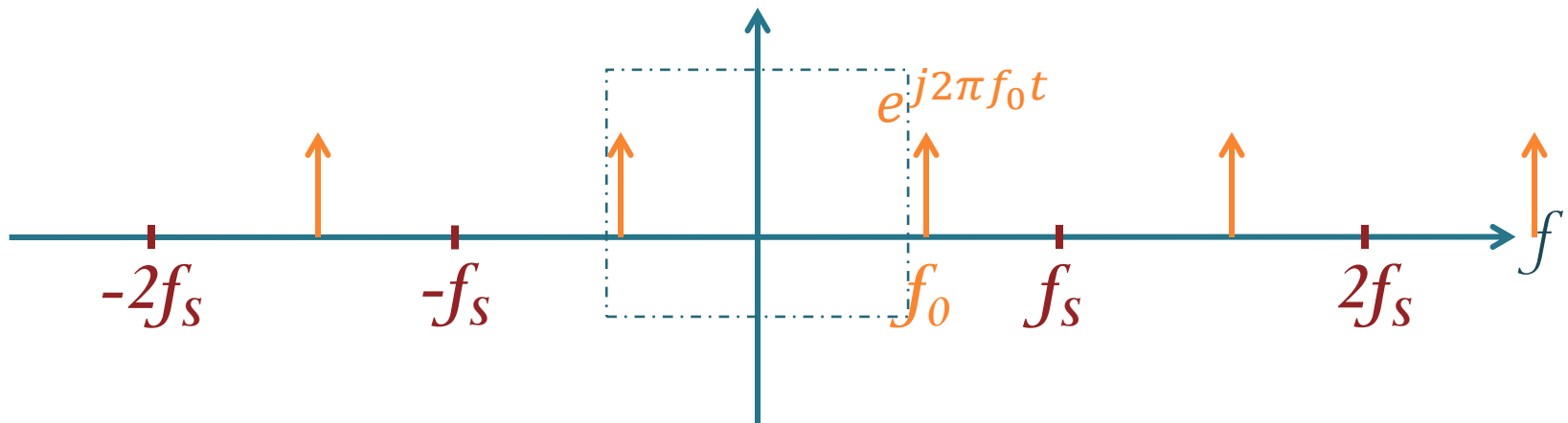


# Aliasing: One complex exponential

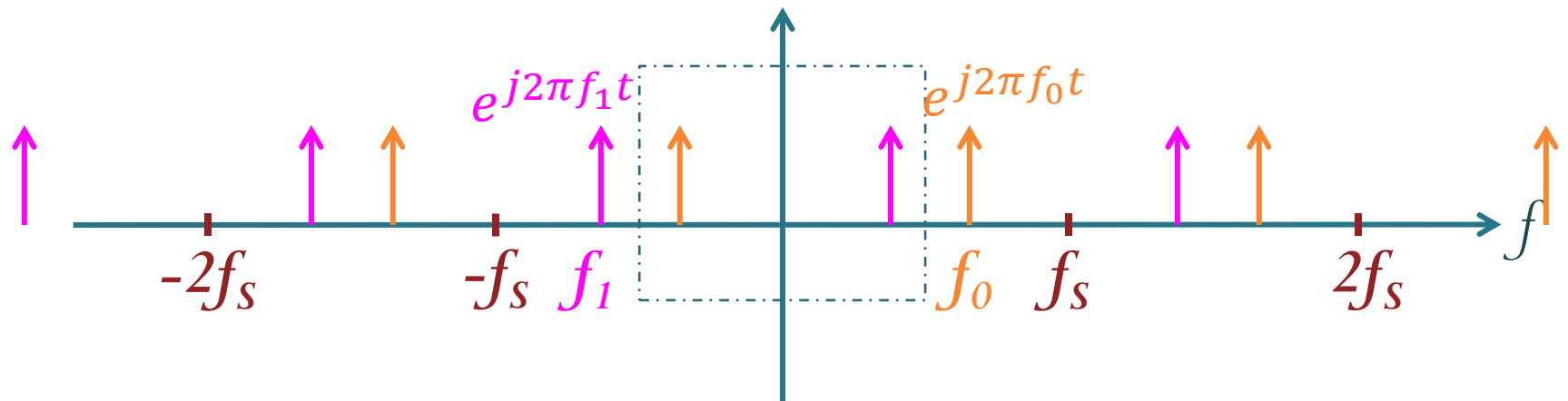
Let's increase  $f_0$



# Aliasing: One complex exponential



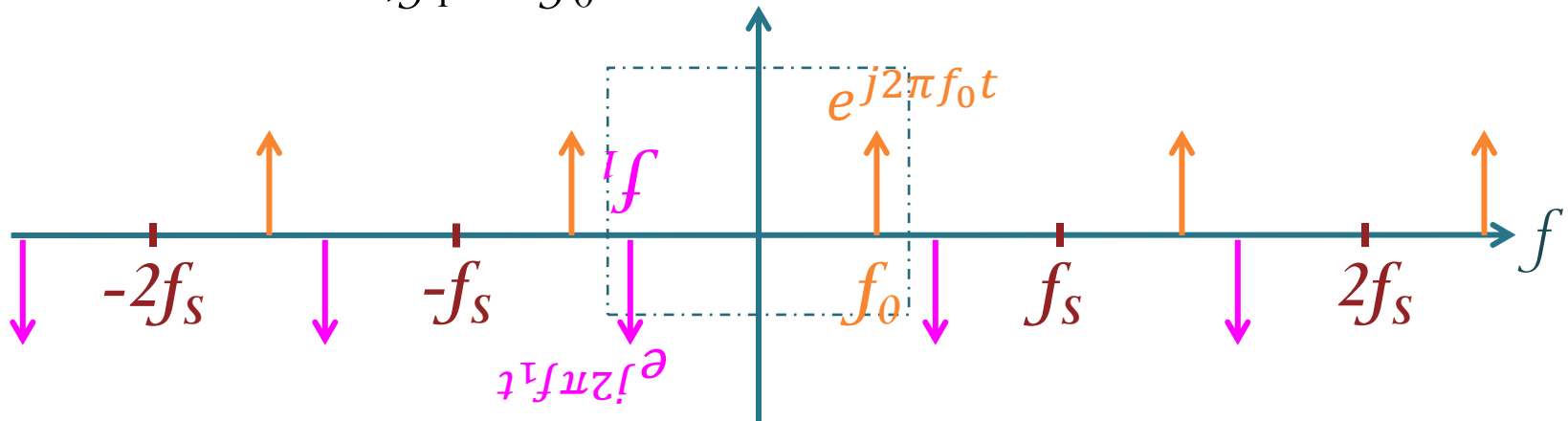
# Aliasing: Two complex exponentials



# Aliasing: Two complex exponentials

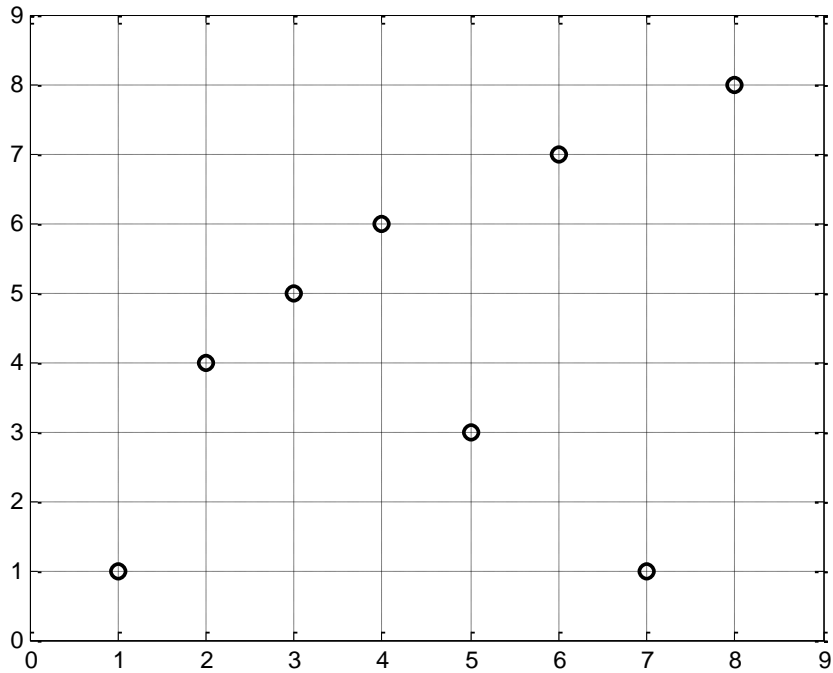
Let's change  $f_0$  and  $f_1$ .

For sine wave,  $f_1 = -f_0$ .

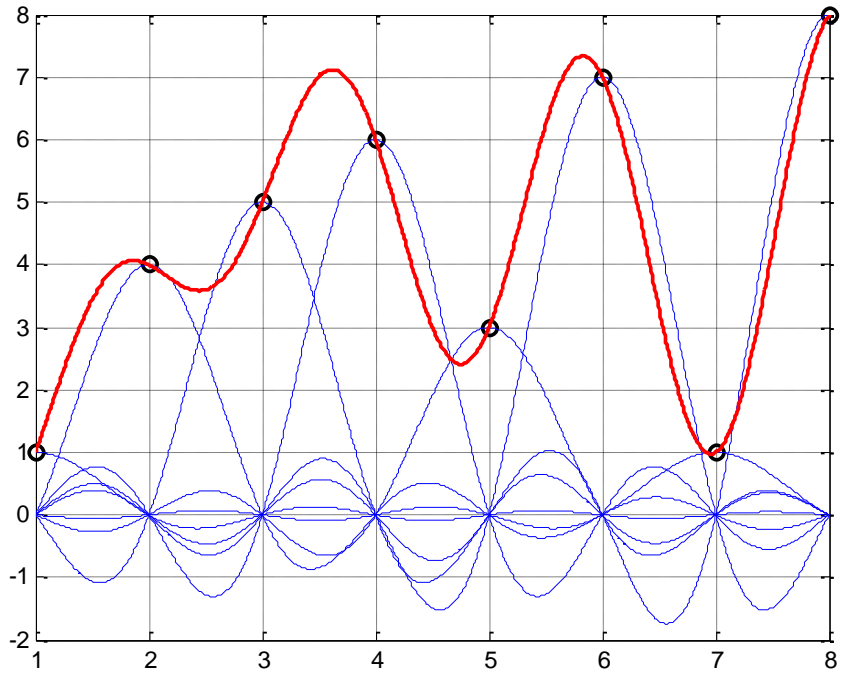


# Reconstruction

$m[k]$



$m(t)$



# Practical Reconstruction

