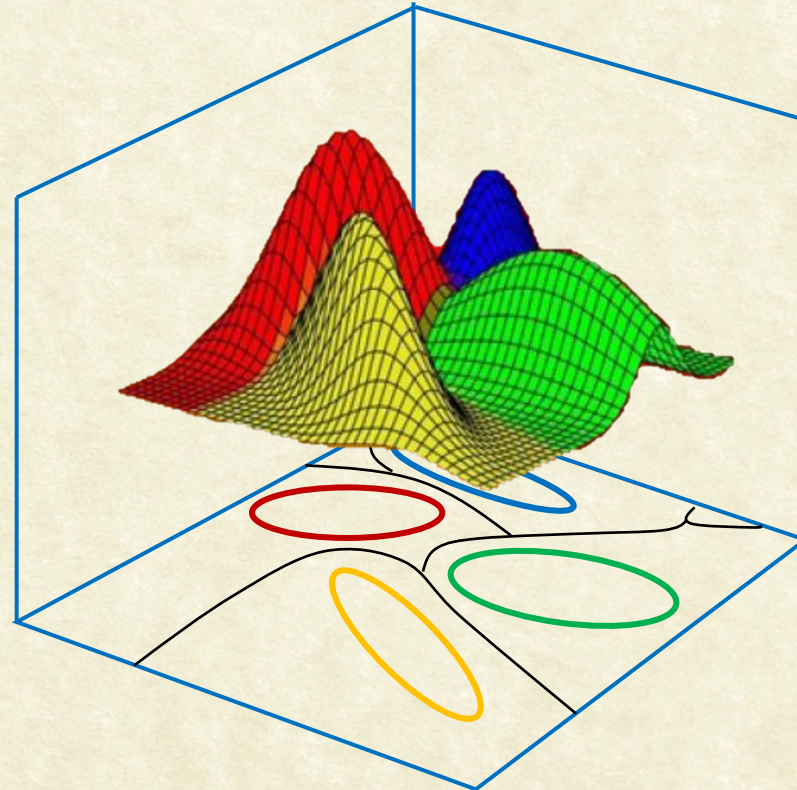




# CS7.404: Digital Image Processing

Monsoon 2023: Frequency Domain

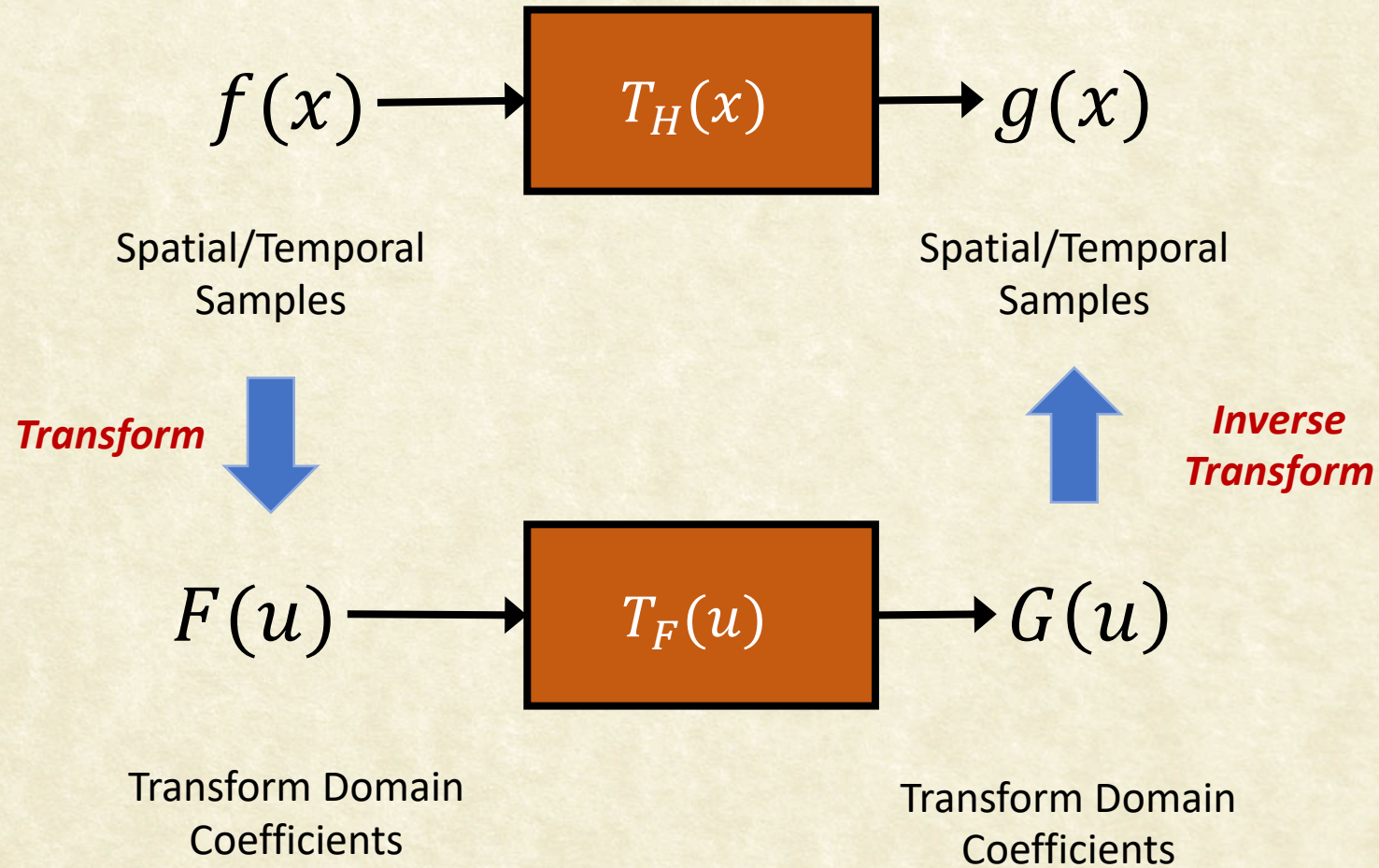


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Biometrics and Secure ID Lab, CVIT,  
IIIT Hyderabad





# The Systems View







# Spatial vs. Transform Domain Processing



Bandhani / Bandhej



Tie Dye





# Spatial vs. Transform Domain Processing

Transform (Tie)



Process (Dye)

Inverse Transform (Untie)

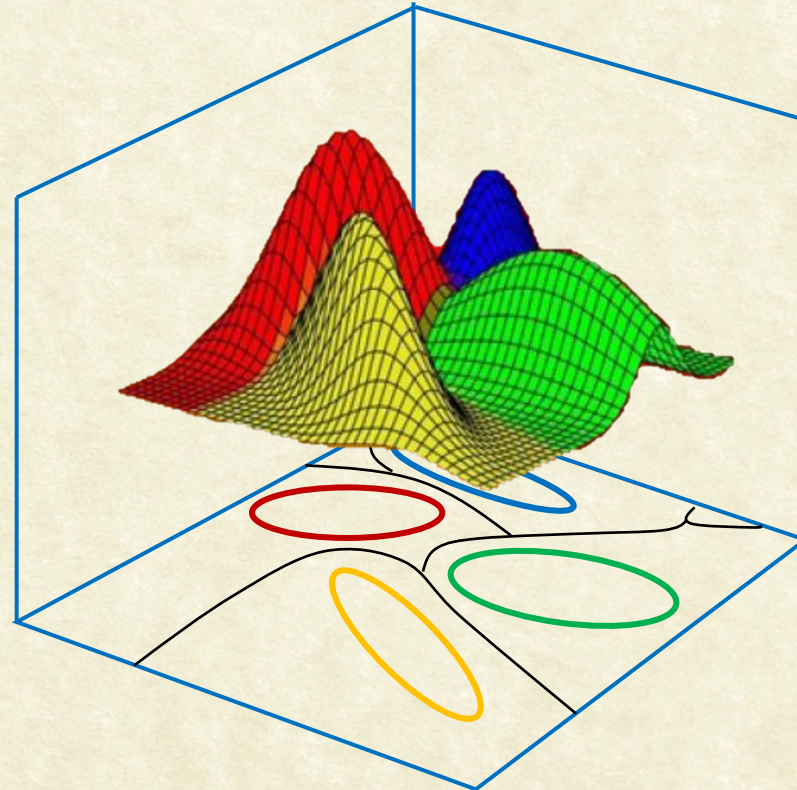






# CS7.404: Digital Image Processing

## Monsoon 2023: Frequency Domain Basics



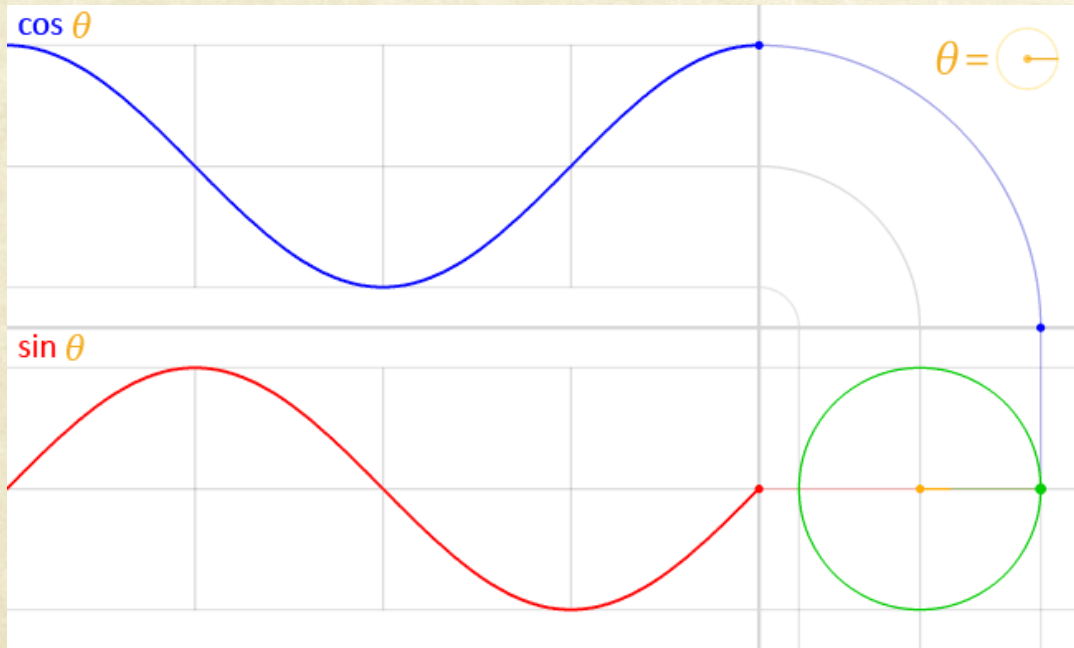
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Biometrics and Secure ID Lab, CVIT,  
IIIT Hyderabad





# Periodic Signals

- **Periodic** → **Frequency** of occurrence
  - Repetitions/<Unit> (**cycles**/sec = Hz)



$$\frac{4 \sin \theta}{\pi}$$
$$\frac{4 \sin 3\theta}{3\pi}$$
$$\frac{4 \sin 5\theta}{5\pi}$$
$$\frac{4 \sin 7\theta}{7\pi}$$

$$x(t) = A \cos(\omega t) = A \cos(2\pi f t) = A \cos\left(\frac{2\pi}{T} t\right)$$

Angular frequency

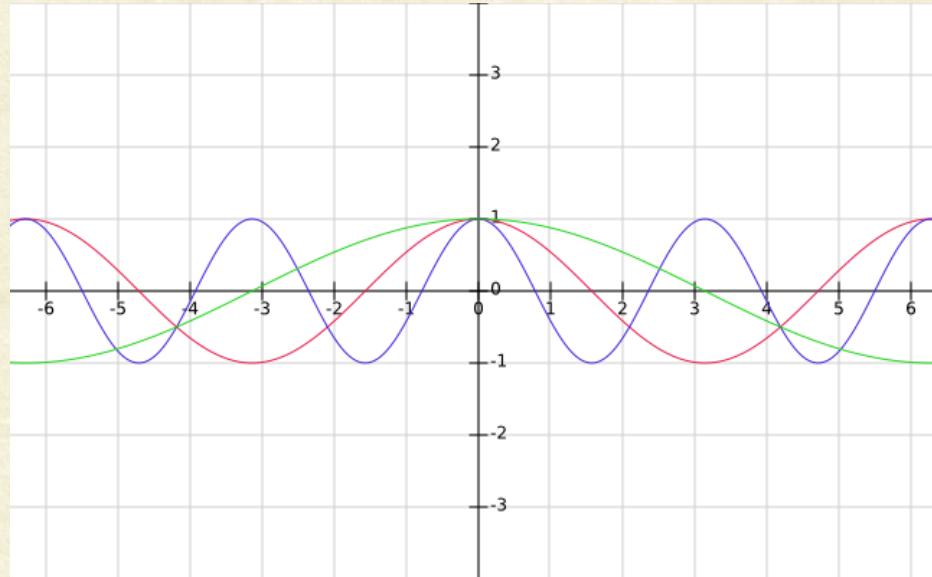
Fundamental Period





# Simple periodic signals

- $x(t) = A \cos(t)$
- $x(t) = A \cos(2t)$
- $x(t) = A \cos(t/2)$



- $x(t) = A \cos(\omega t) = A \cos(2\pi f t) = A \cos\left(\frac{2\pi}{T} t\right)$

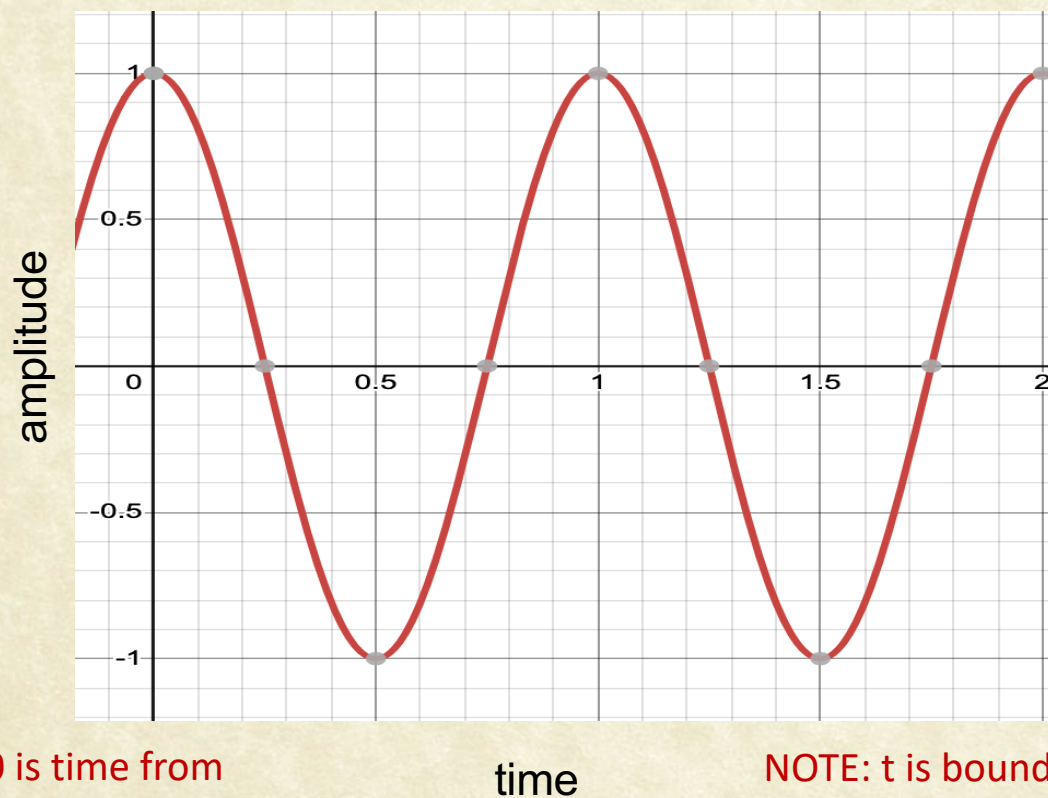
Angular frequency





# Signal and Frequency Domains

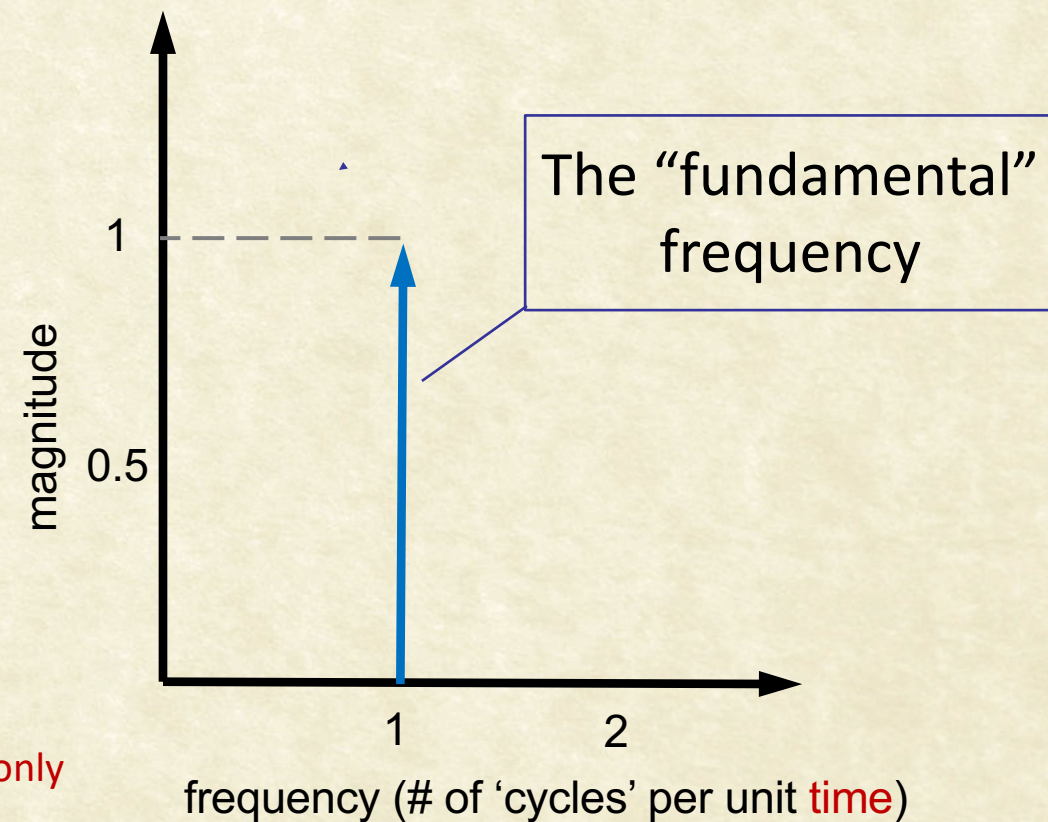
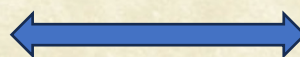
$$y = A \cos(2\pi ft) = \cos(2\pi t)$$



NOTE:  $t=0$  is time from where signal is considered

NOTE:  $t$  is bounded only for physical signals

**Time domain**



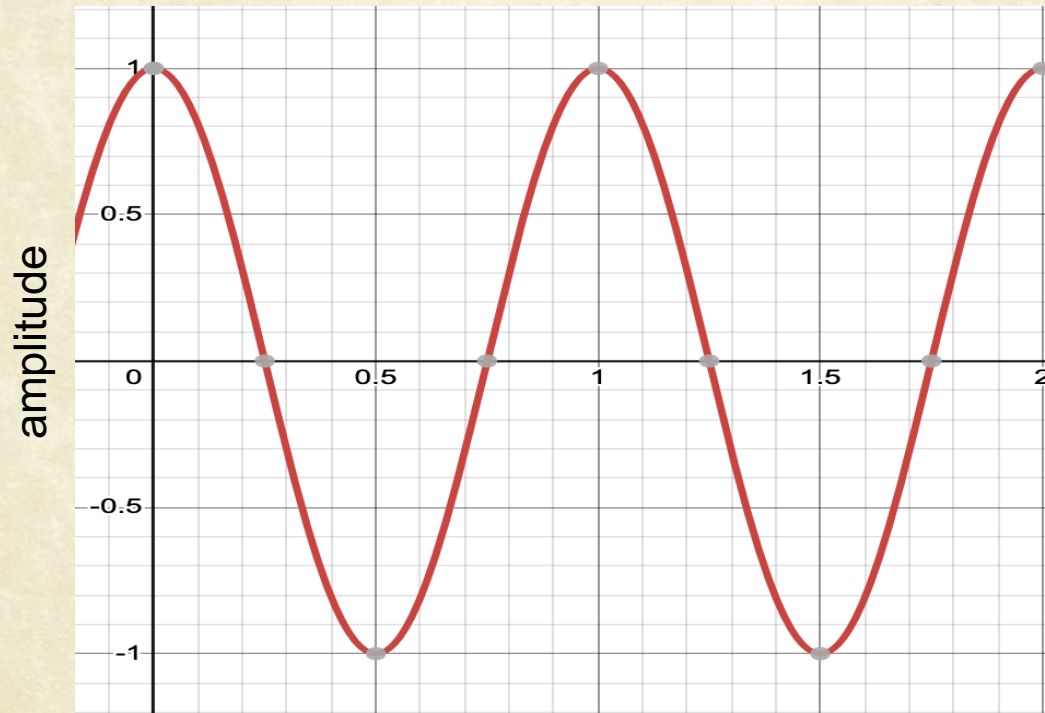
**Frequency domain**





# Signal and Frequency Domains

$$y = A \cos(2\pi f s) = \cos(2\pi s)$$

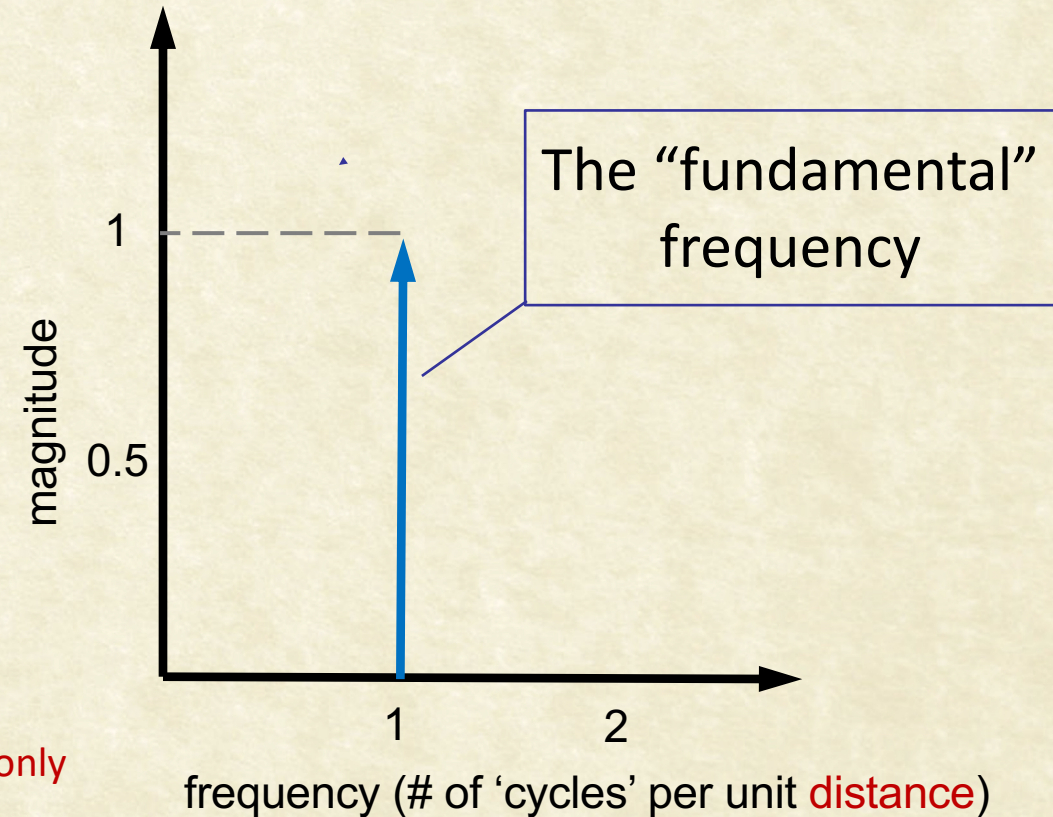
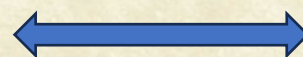


NOTE:  $s=0$  is time from where signal is considered

Spatial distance (**s**)

NOTE:  $s$  is bounded only for physical signals

**Spatial domain**



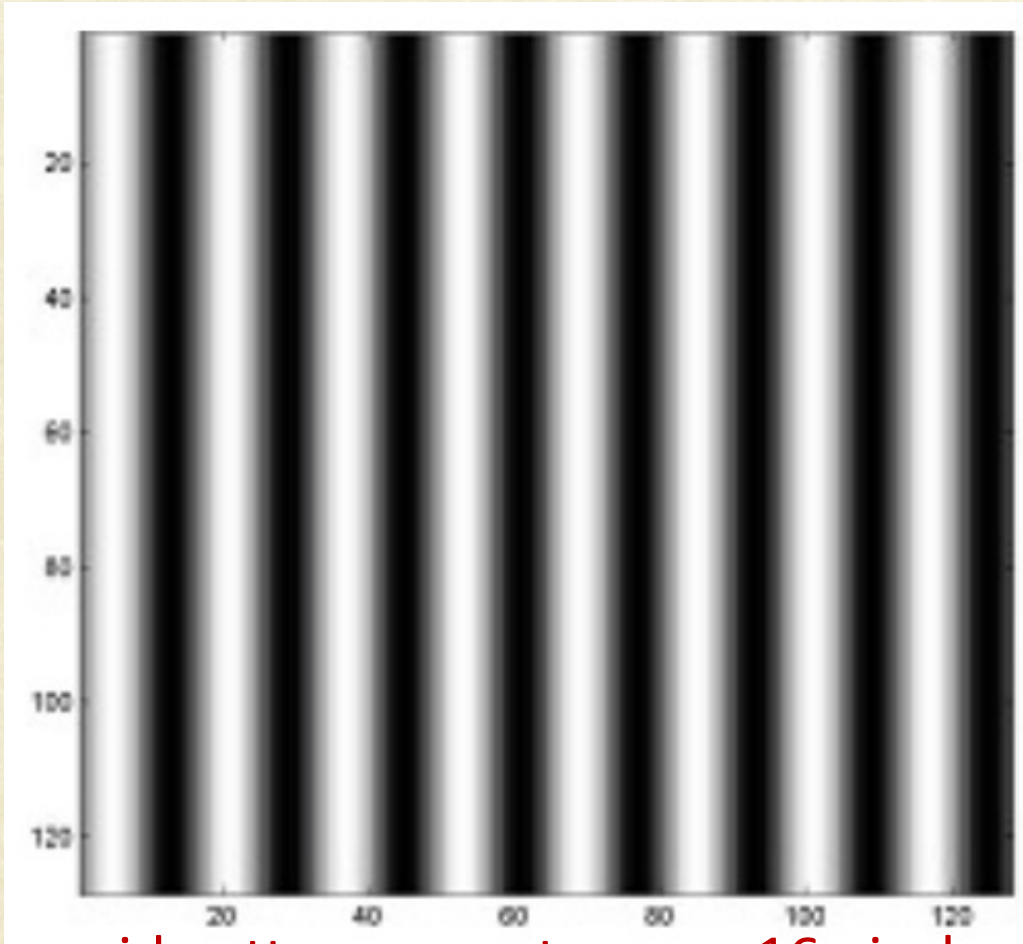
**Frequency domain**



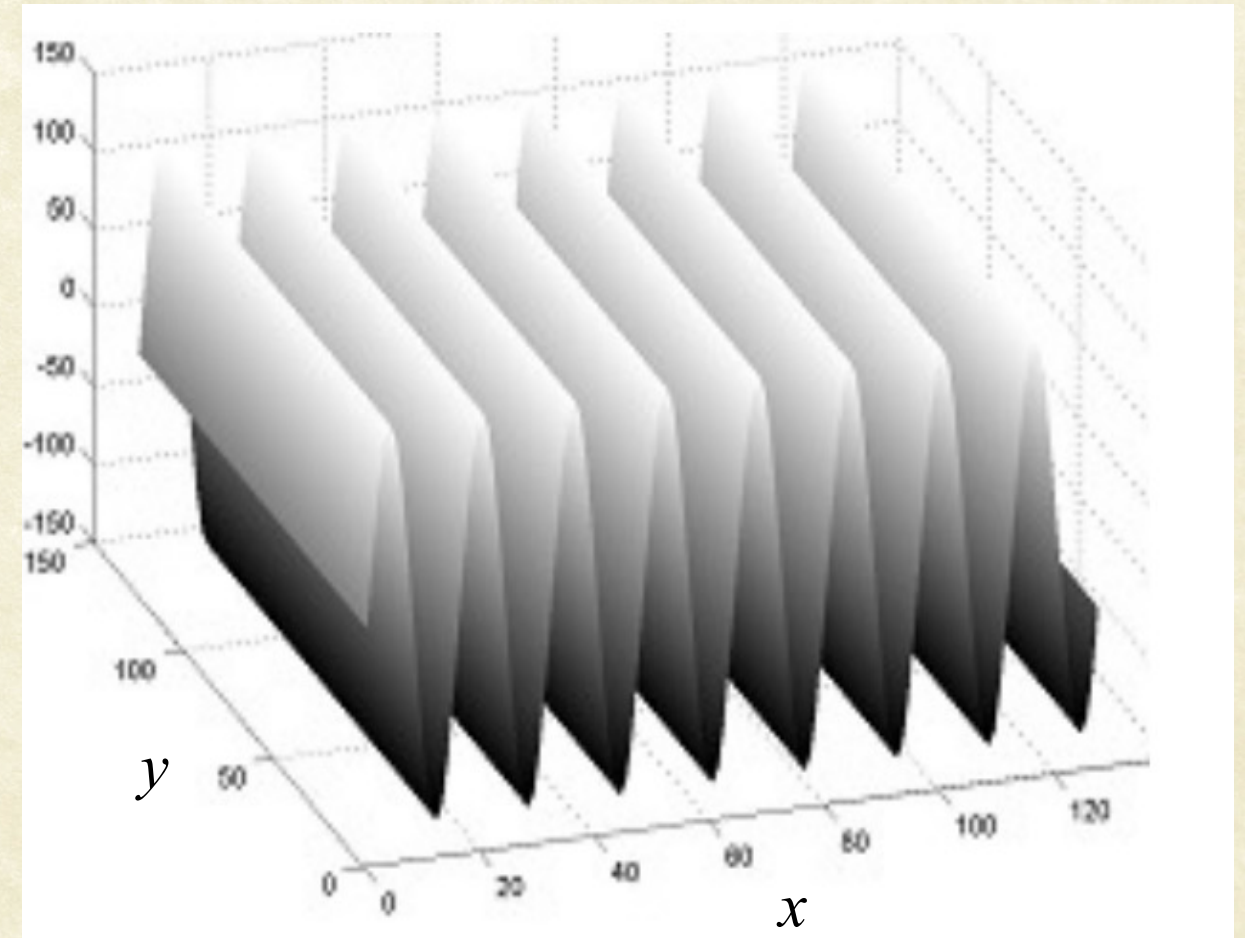


# Periodic Signals in Images

128 x 128 grayscale image



$$I(x, y) = 128 \sin(2\pi x/16)$$



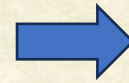
Sinusoid pattern repeats every 16 pixels  
 $f = 1/16$  cycles/pixel



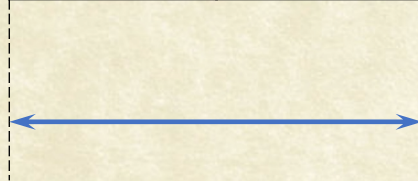


# Periodic Signals in Images

- Spatial period = Minimal # of pixels between two identical patterns in a “periodic” image



$$v_{max} = \frac{1}{\text{minimal period}} = \frac{1}{2}$$



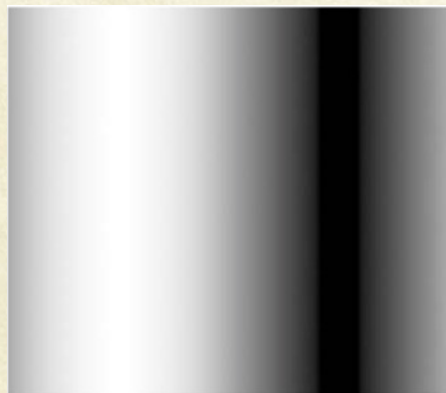
Minimal Period:  
2 pixels





# Extending sinusoids to 2D

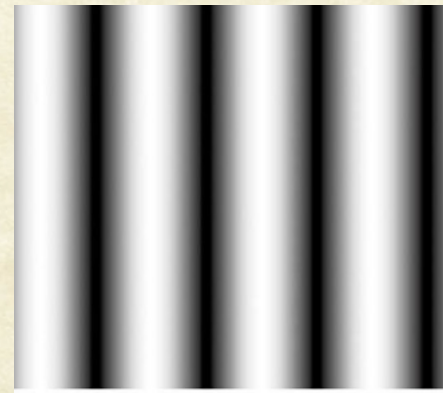
$$s(x, y) = \sin[2\pi(u_0x + v_0y)]$$



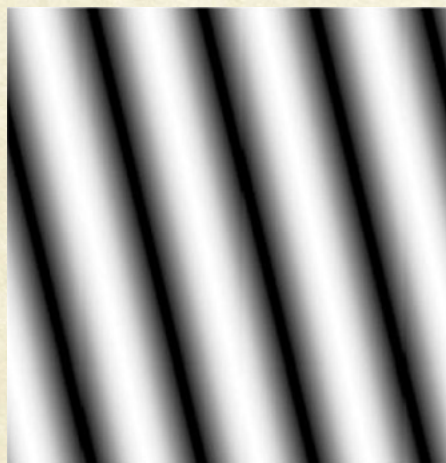
$$u_0 = 1, v_0 = 0$$



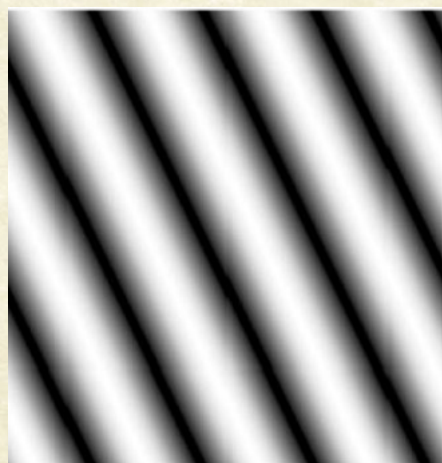
$$u_0 = 2, v_0 = 0$$



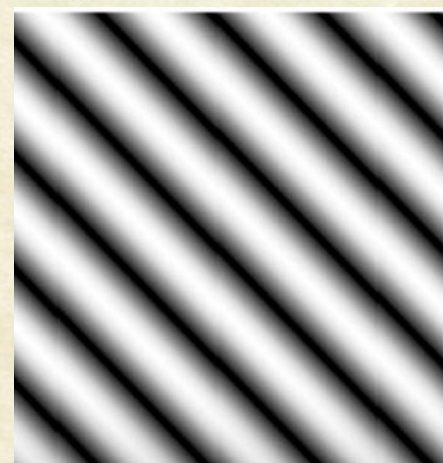
$$u_0 = 4, v_0 = 0$$



$$u_0 = 4, v_0 = 1$$



$$u_0 = 4, v_0 = 2$$



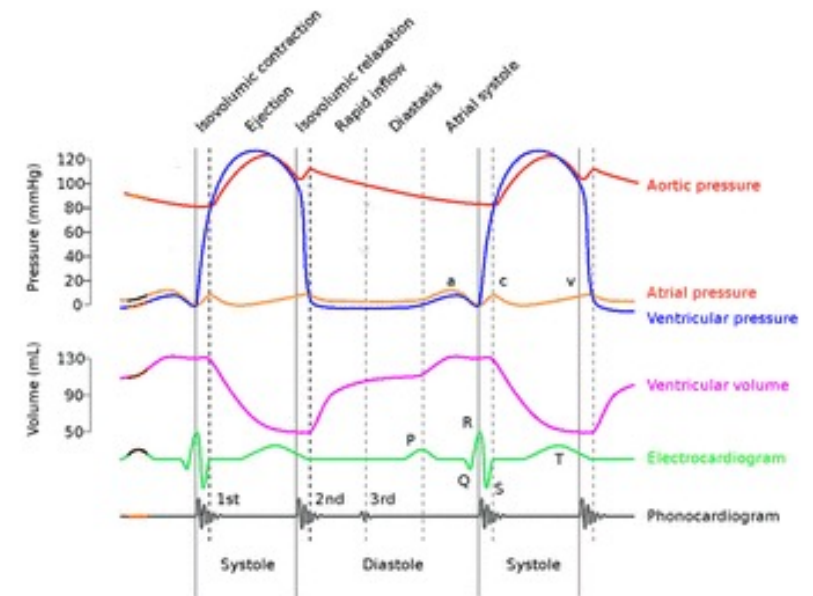
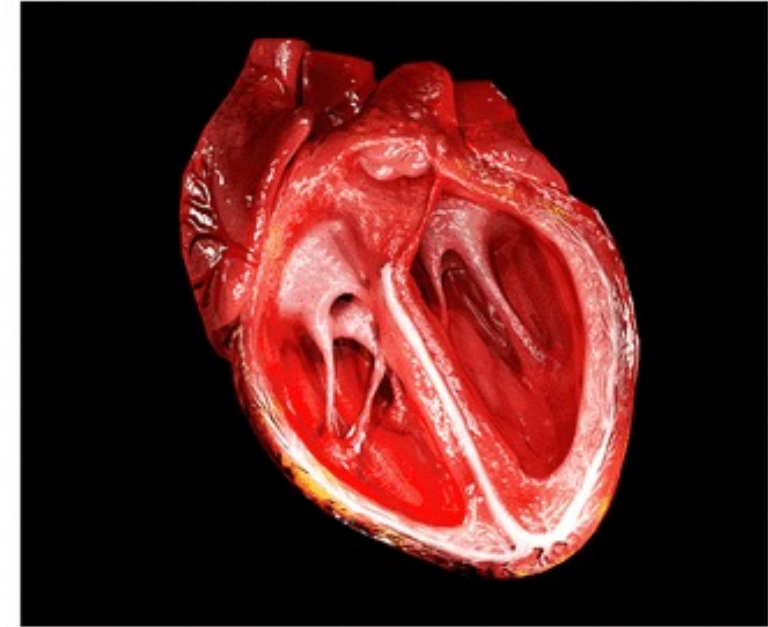
$$u_0 = 4, v_0 = 4$$





Many natural phenomena (signals) are periodic but not necessarily sinusoidal

## CARDIAC CYCLE

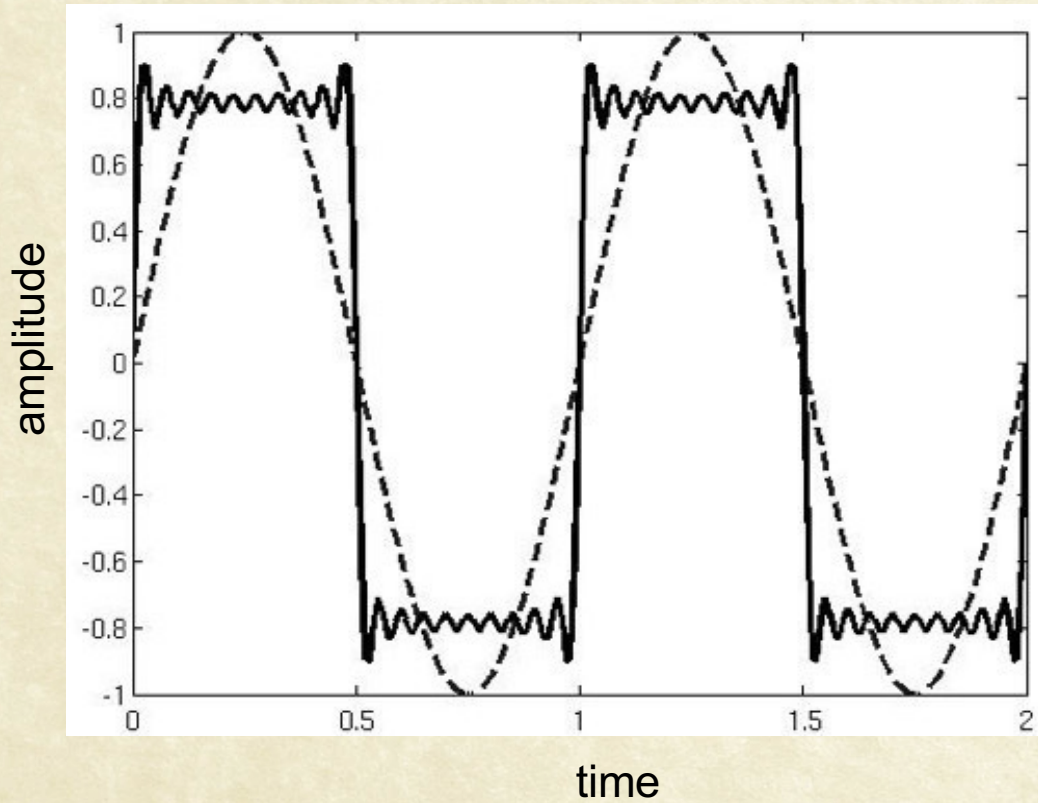




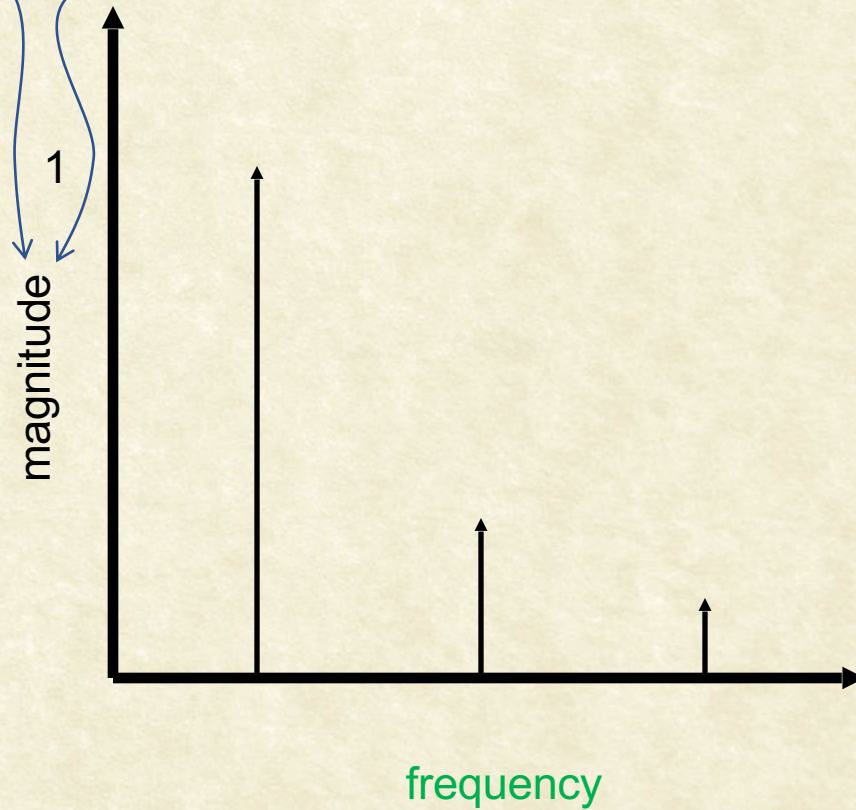


# Fourier Series

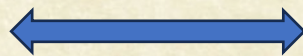
$$y(t) = \sum_n a_n \sin(nf \times 2\pi t) + \sum_n b_n \cos(nf \times 2\pi t)$$



Signal domain



Frequency Spectrum







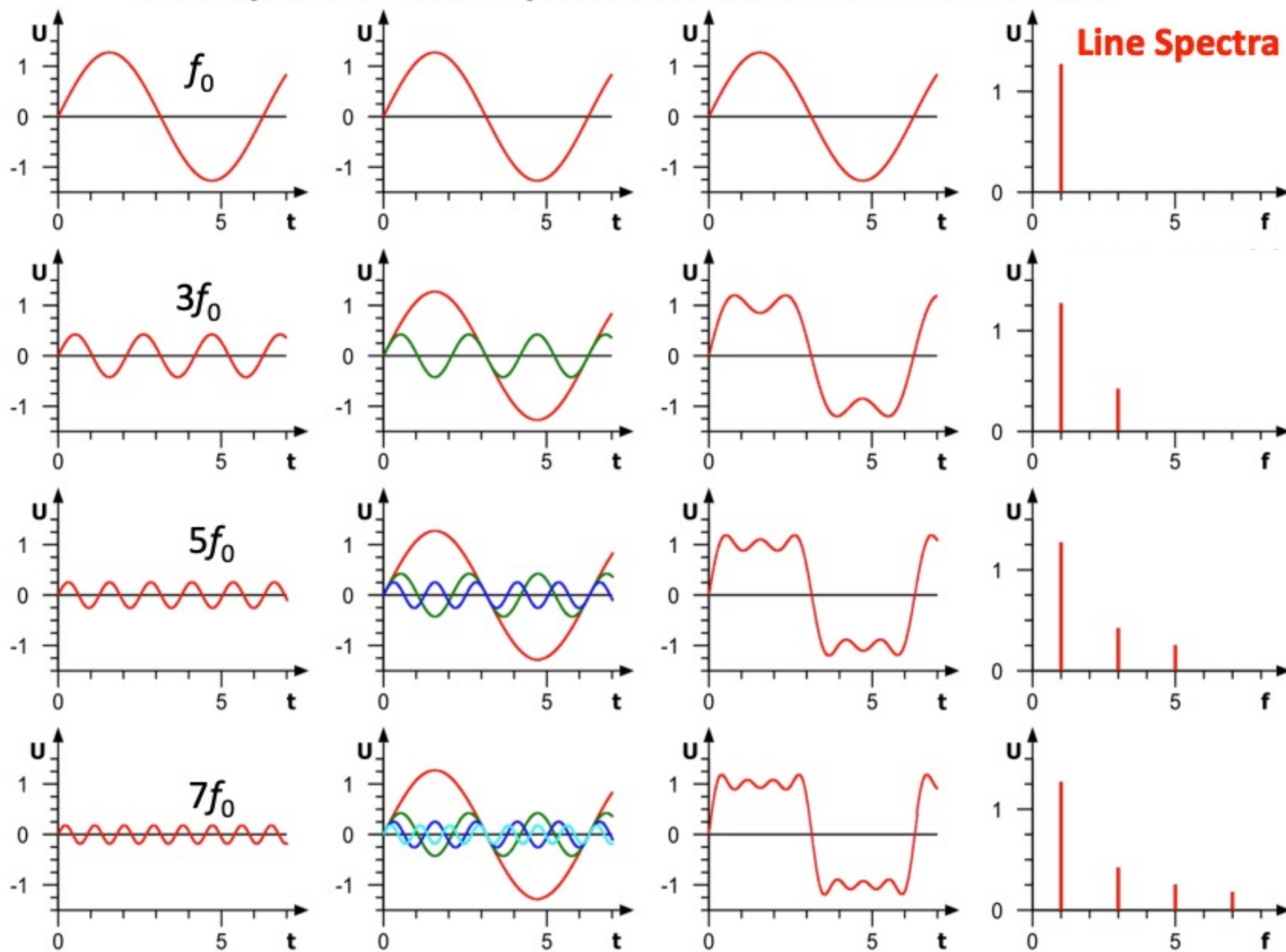
# Fourier Series, visually







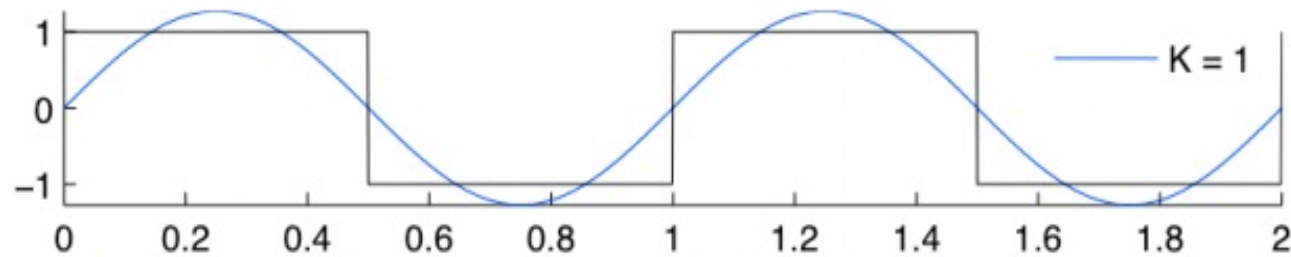
## Example: Periodic Square Wave as Sum of Sinusoids



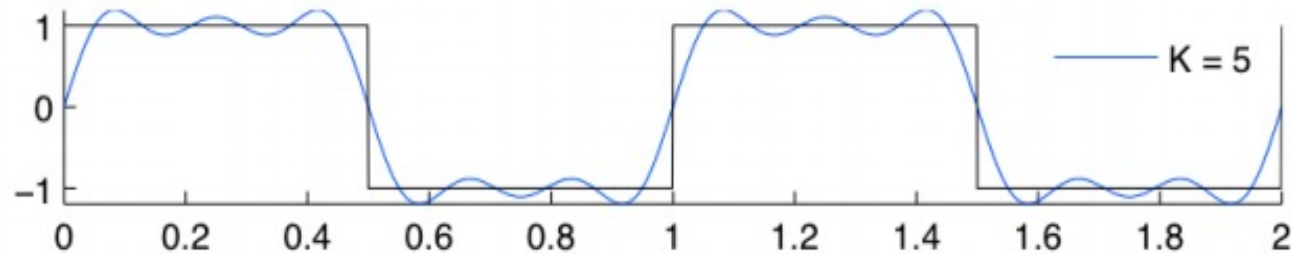




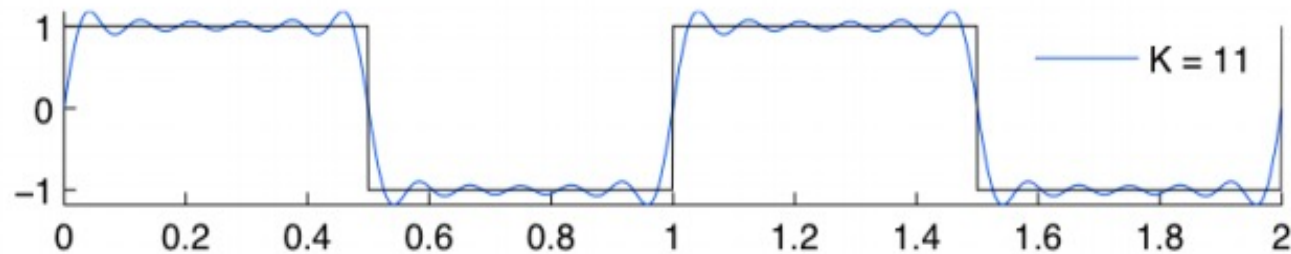
$$f(t) = \frac{4}{\pi} \left[ \sin(\pi t) + \frac{1}{3} \sin(3\pi t) + \frac{1}{5} \sin(5\pi t) + \frac{1}{7} \sin(7\pi t) + \dots \right]$$



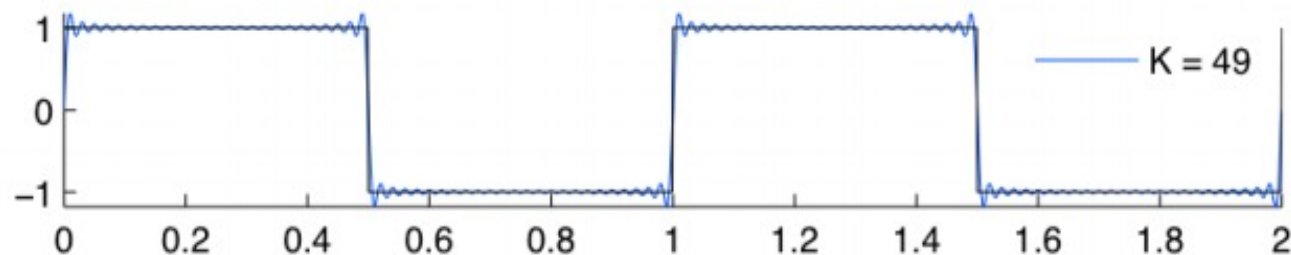
**Fundamental only**



**Five terms**



**Eleven terms**



**Forty-nine terms**





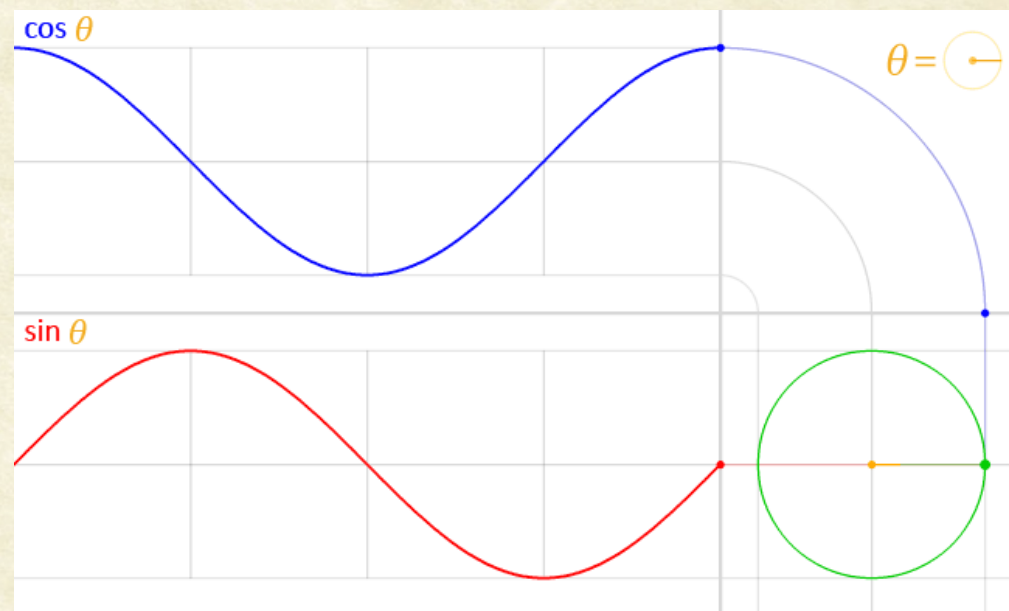
be rational  
 $i$   
guys...  
 $e$   
get real  
 $\pi$

$$e^{i\pi} + 1 = 0$$

Euler's identity:  
uniting constants  
since 1748

$$e^{it} = \cos t + i \sin t$$

$$i = \sqrt{-1}$$



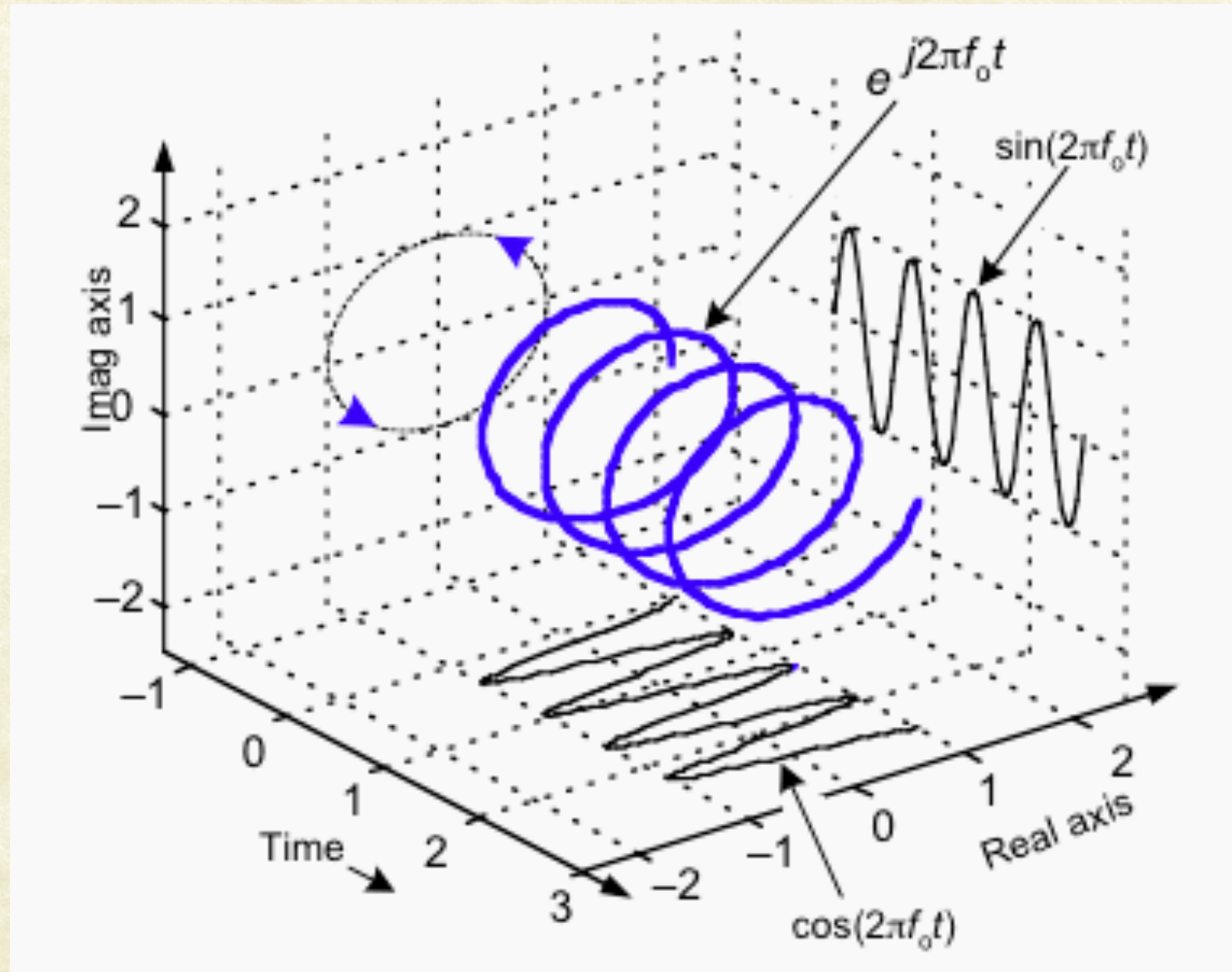




# Complex sinusoid

$$e^{it} = \cos t + i \sin t$$

$$i = \sqrt{-1}$$







Questions?