

# SIGNAL PROCESSING

- Professor: Rubén Alvarez

# CONTENT

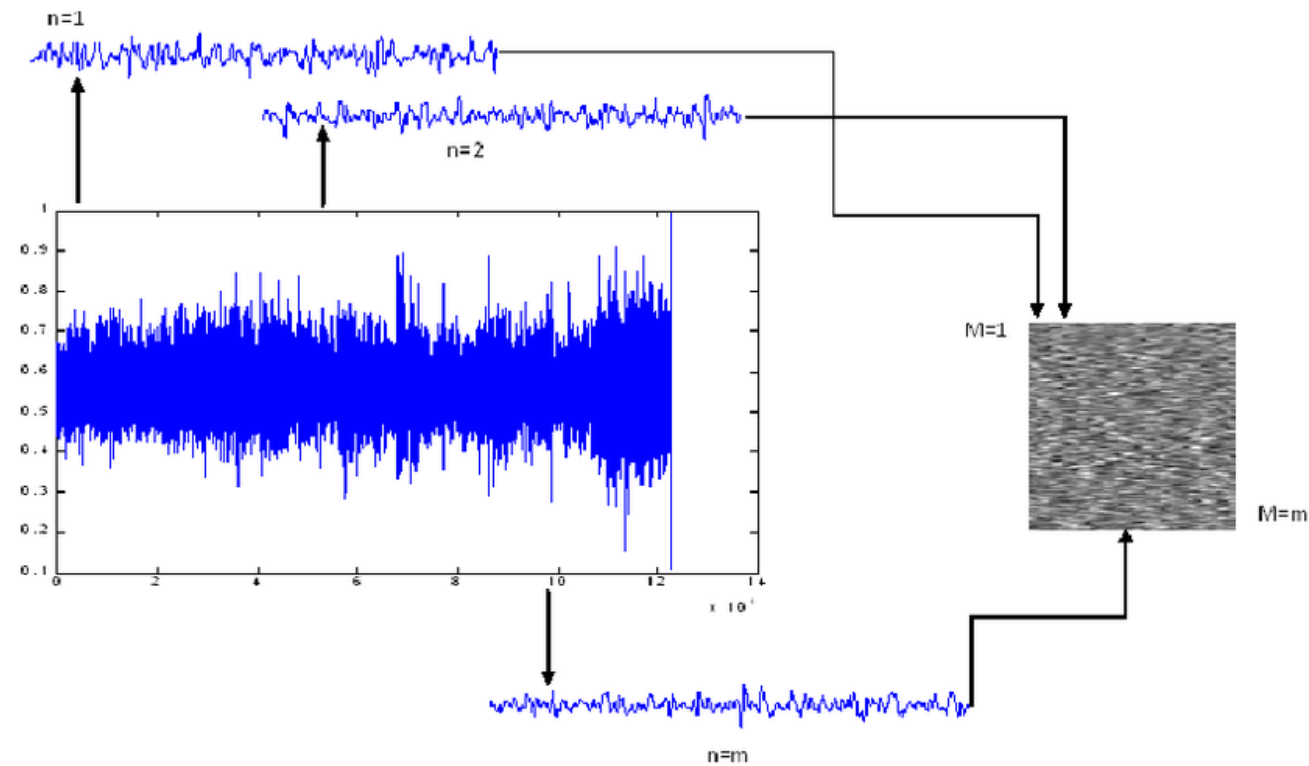
- What is a signal?
- Fourier Transform?
- What is the convolution?
- Why we need signal processing in Computer Vision?

# WHY DO I NEED TO KNOW SIGNAL PROCESSING?

# WHY DO I NEED TO KNOW SIGNAL PROCESSING?

- A digital image can be seen as the result of applying a "sampling" to a continuous signal in two directions.
- I mean...

# AN IMAGE IS A 2D SIGNAL



# WHAT IS A SIGNAL?

# WHAT IS A SIGNAL?

- It's a flow of information
- A measure of amounts that vary in intensity with respect to time or position.
- An electrical signal received from a transducer (microphone, thermometer, accelerometer, antenna, etc.)
- An electrical signal that controls a process.
- And so on ..

# TYPES OF SIGNALS

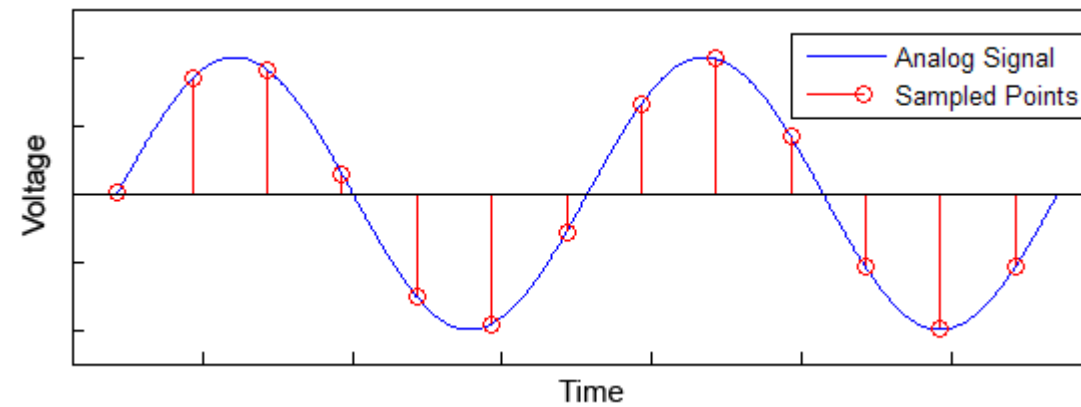
- Analog
- Digital



¿ADC?

# HOW DO WE GO FROM AN ANALOG SIGNAL TO A DIGITAL SIGNAL?

# ¿SAMPLING?

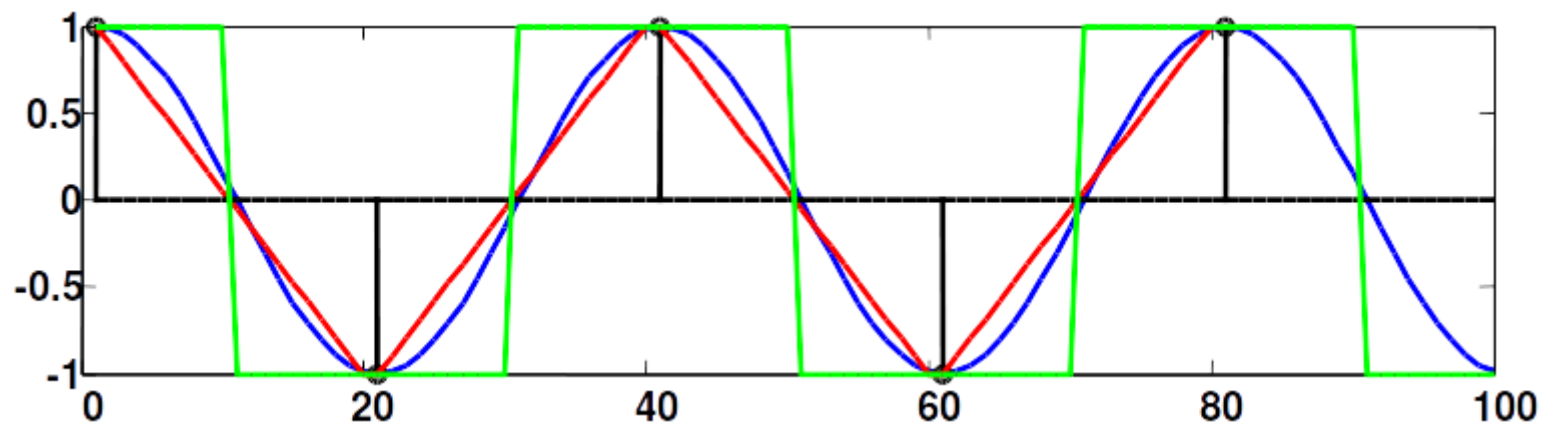


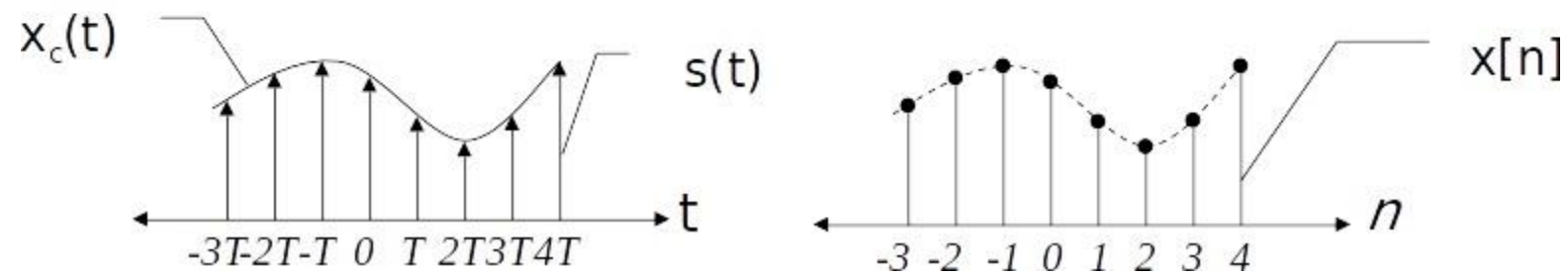
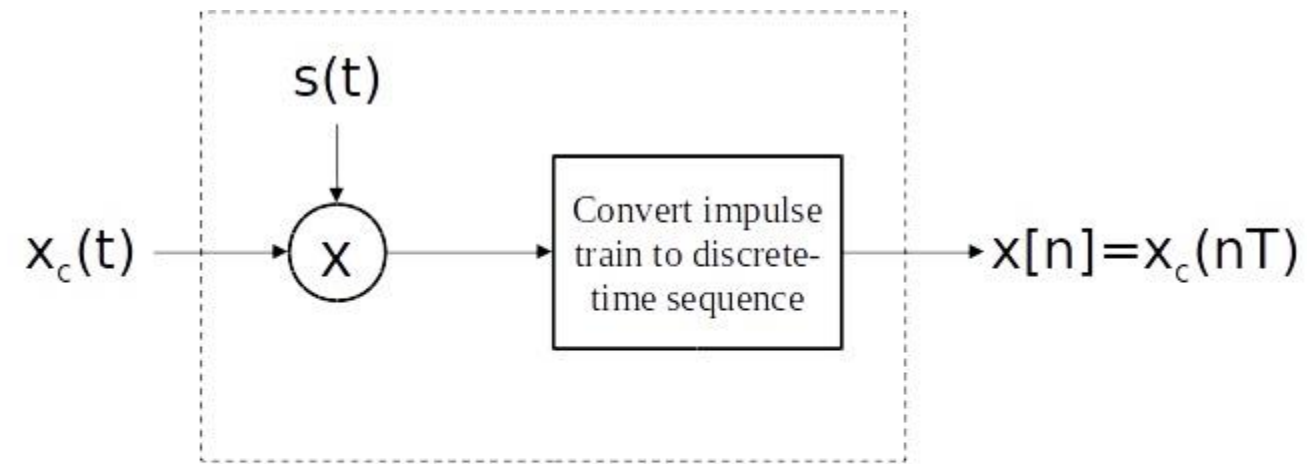
# SAMPLING

- Sampling is commonly a periodic.
- $x[n] = x_c(nT)$  con  $-\infty < n < \infty$
- $T$  It's the "sampling" period in seconds
- $f_s = \frac{1}{T}$  is the frequency of "sampling" in  $Hz$
- The frequency of "sampling" in radians will be  $\Omega_s = 2\pi f_s \text{ rad/sec}$
- It is commonly used  $[\cdot]$  for signals in discrete time and  $(\cdot)$  for continuous-time signals.

CAN WE GO FROM DIGITAL TO ANALOG?

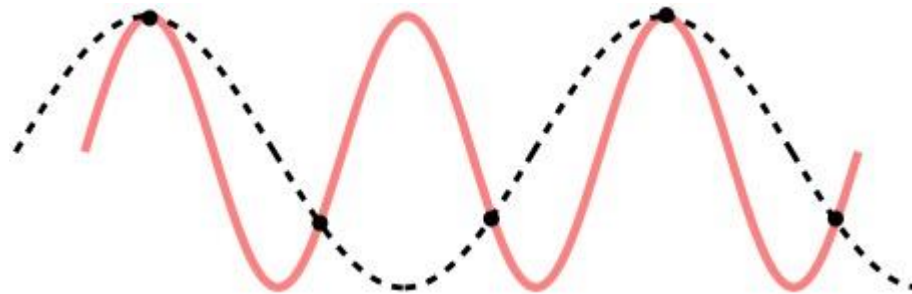
USUALLY NOT...





# NYQUIST-SHANNON THEOREM

- The sampling frequency must be at least twice the bandwidth of the signal.





## THEN...AN IMAGE IS A SPECIAL CASE OF A 2D SIGNAL

- An image can take a continuous value within an interval.
- An image is discrete so it can take values from an accounting set, for example in a finite set of  $\{0, 1, 2, \dots, 255\}$  for an image depicted in 8-bits.

## THEN...AN IMAGE IS A SPECIAL CASE OF A 2D SIGNAL

- Values always come from continuous quantization, for example a digital analog conversion or a count as in nuclear images.
- A binary image only takes values  $\{0, 1\}$ .

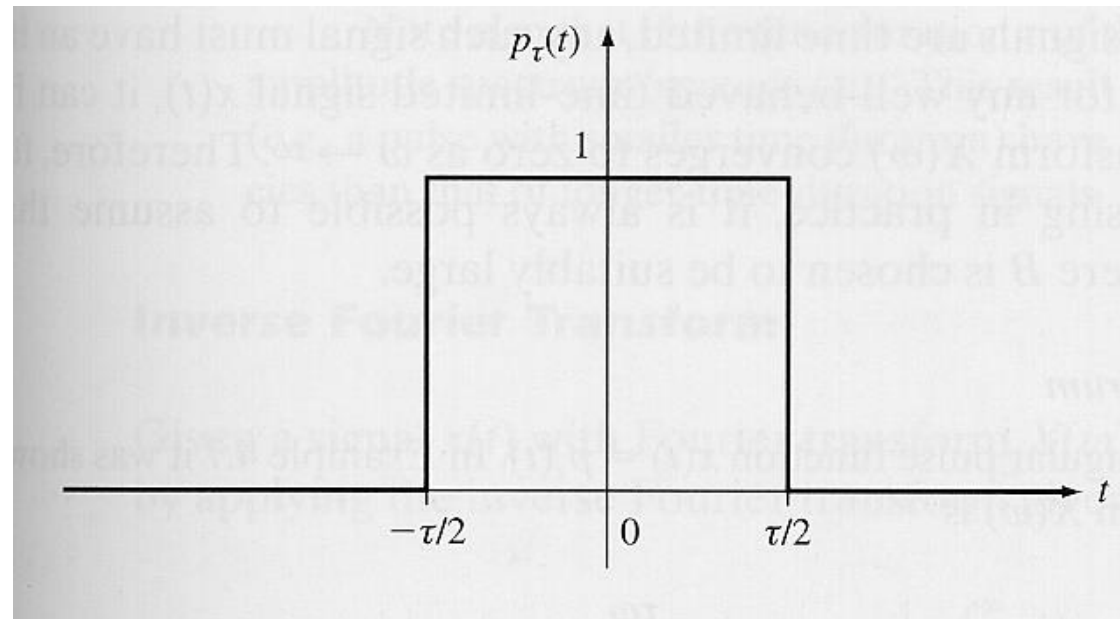
SO WE MUST LEARN EVERYTHING AGAIN FOR A 2D  
SIGNAL?

# FOURIER TRANSFORM

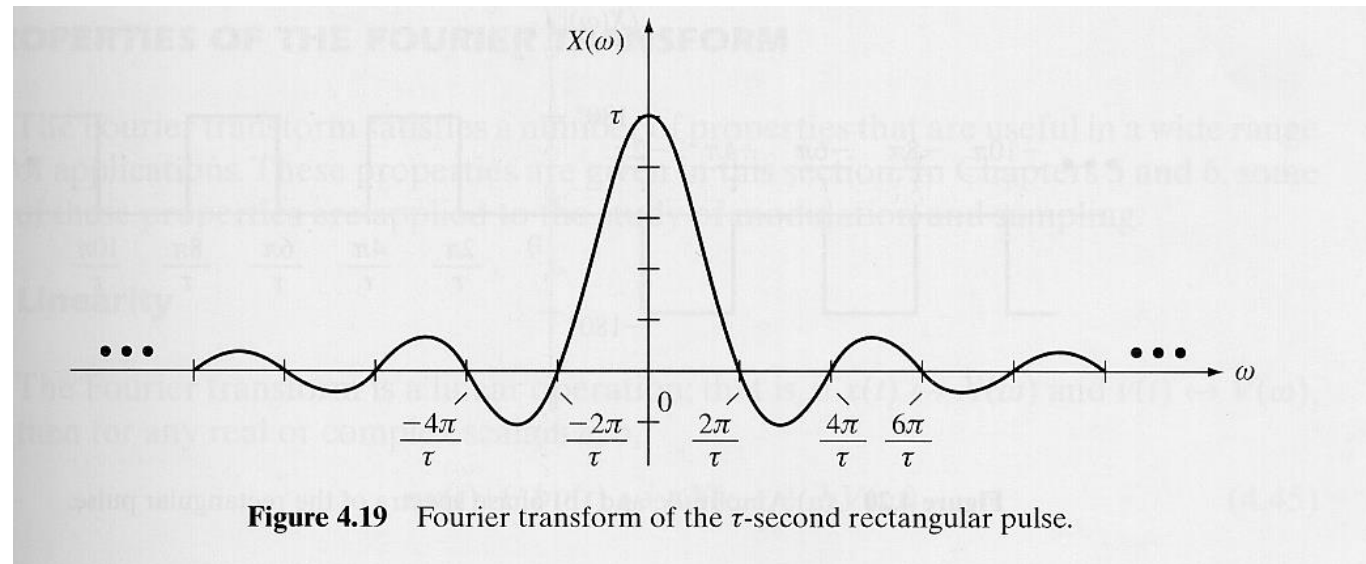
$$\mathcal{F}(\omega) = \frac{1}{2\pi} \int_{-\infty}^{\infty} f(t) e^{-i\omega t} dt$$

$$f(t) = \frac{1}{2\pi} \int_{-\infty}^{\infty} F(\omega) e^{i\omega t} d\omega$$

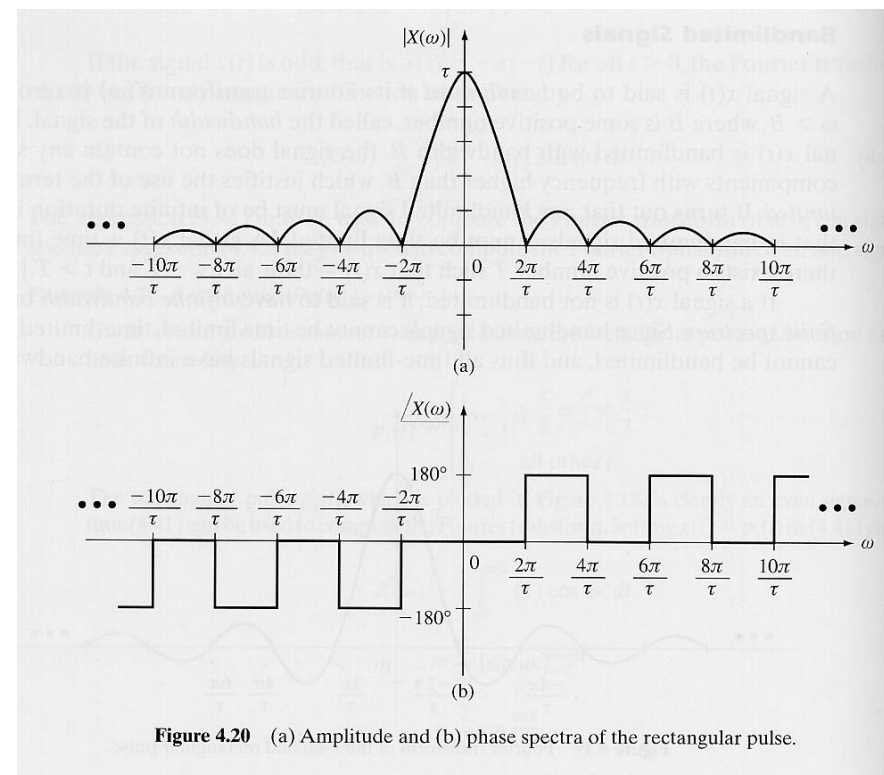
# RECTANGULAR PULSE



# FOURIER TRANSFORM



# SPECTRUM IN AMPLITUDE AND PHASE



AND WHAT DOES THE FREQUENCY OF AN IMAGE,  
TELL ME?



# WHAT IS THE CONVOLUTION?

# CONVOLUTION

- Continuous

$$(f * g)(t) = \int_{-\infty}^{\infty} f(\eta)g(t - \eta) d\eta$$

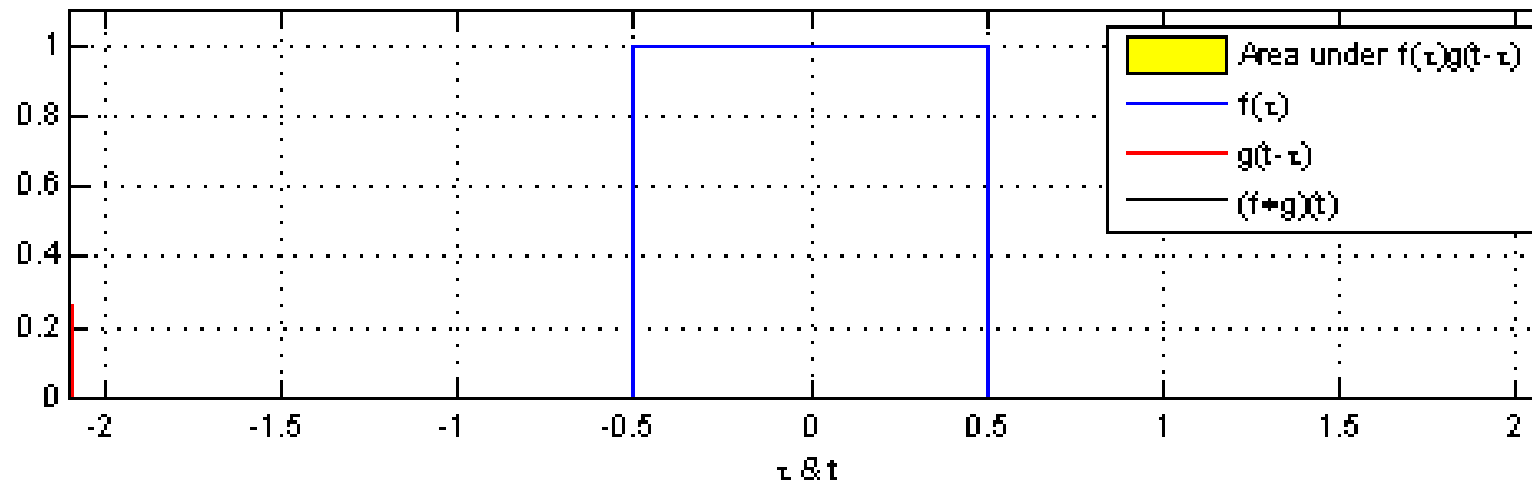
- Discrete

$$(f * g)[n] = \sum_{-\infty}^{\infty} f[m]g[n - m]$$

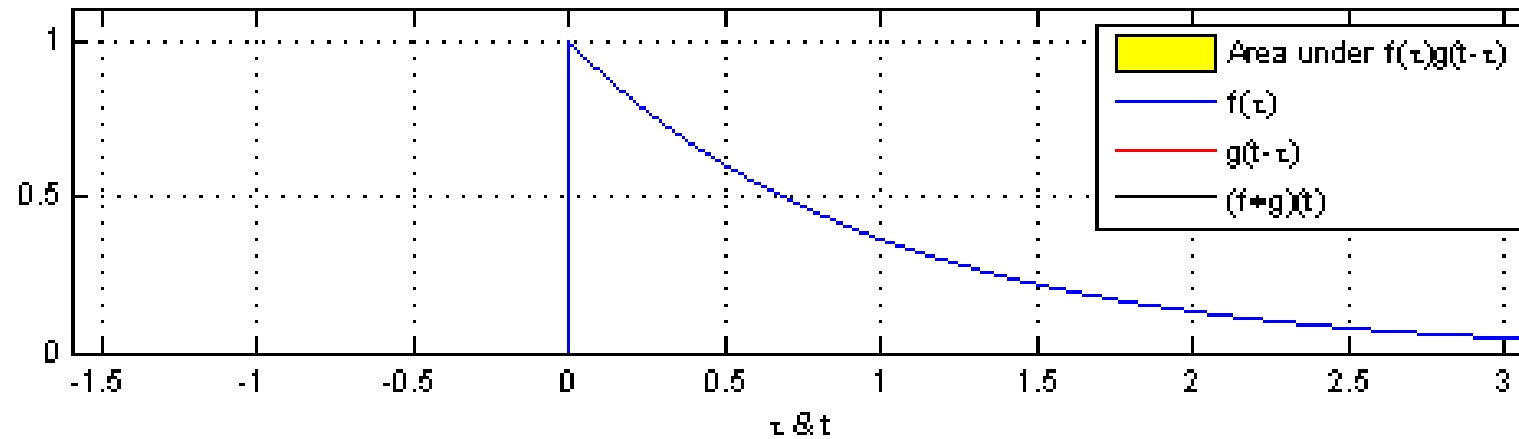
# 2D CONVOLUTION

$$y_{k,l} = \sum_{m=-1}^1 \sum_{n=-1}^1 x_{k-m,l-n} g_{m,n}$$

# WHAT IS CONVOLUTION?



# WHAT IS CONVOLUTION?



# CONVOLUTION THEOREM

$$\mathcal{F}(f * g) = F(\omega)G(\omega)$$

## PRACTICE 1.2

- Deliver the results of the following in a .pdf file:
- Calculate the Fourier Transform of an image.
  - Calculate the Fourier transform of all frames in a video input.

# Questions?