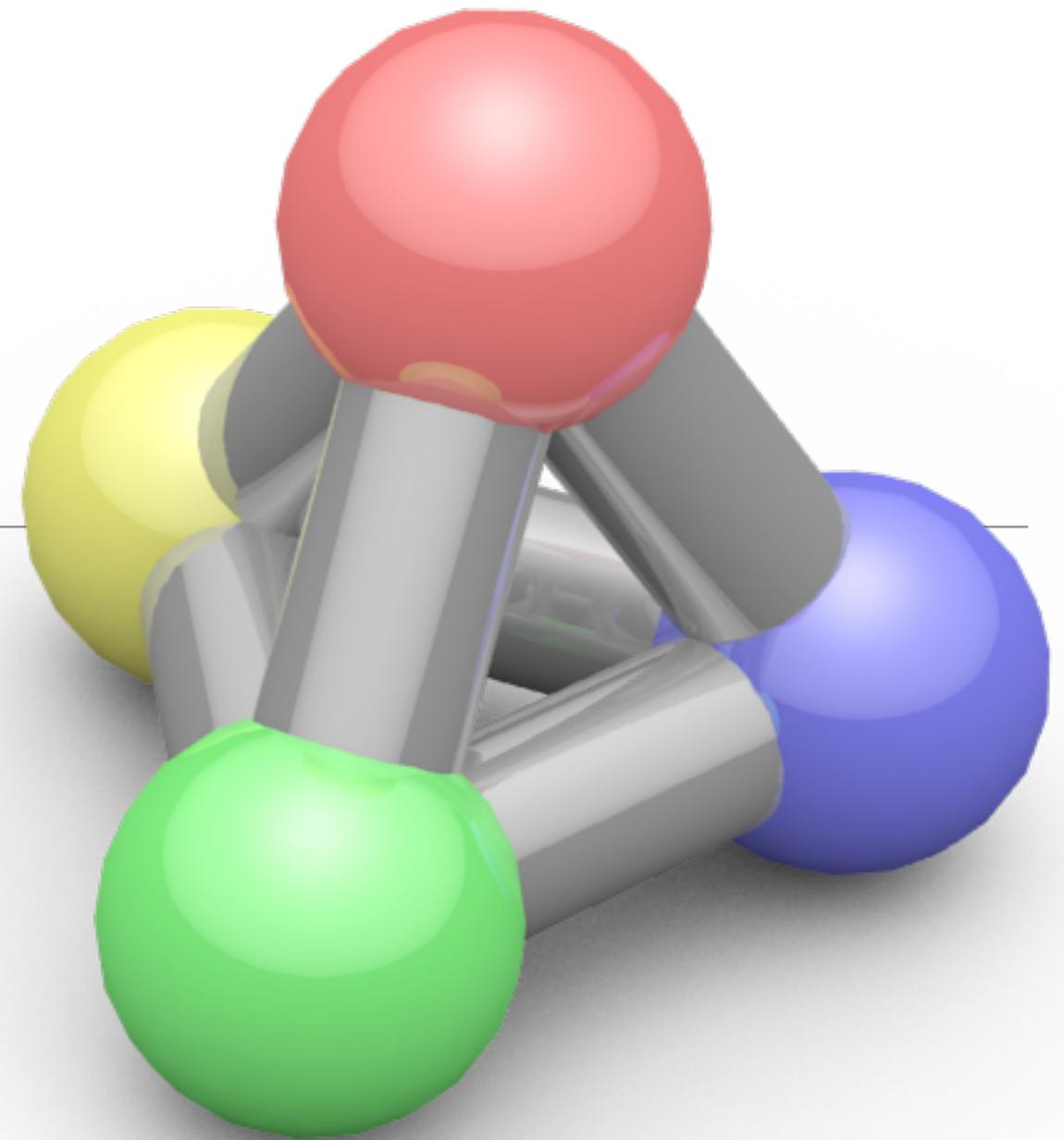


# Some Leftovers

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CPSC 453 – Fall 2016

Sonny Chan



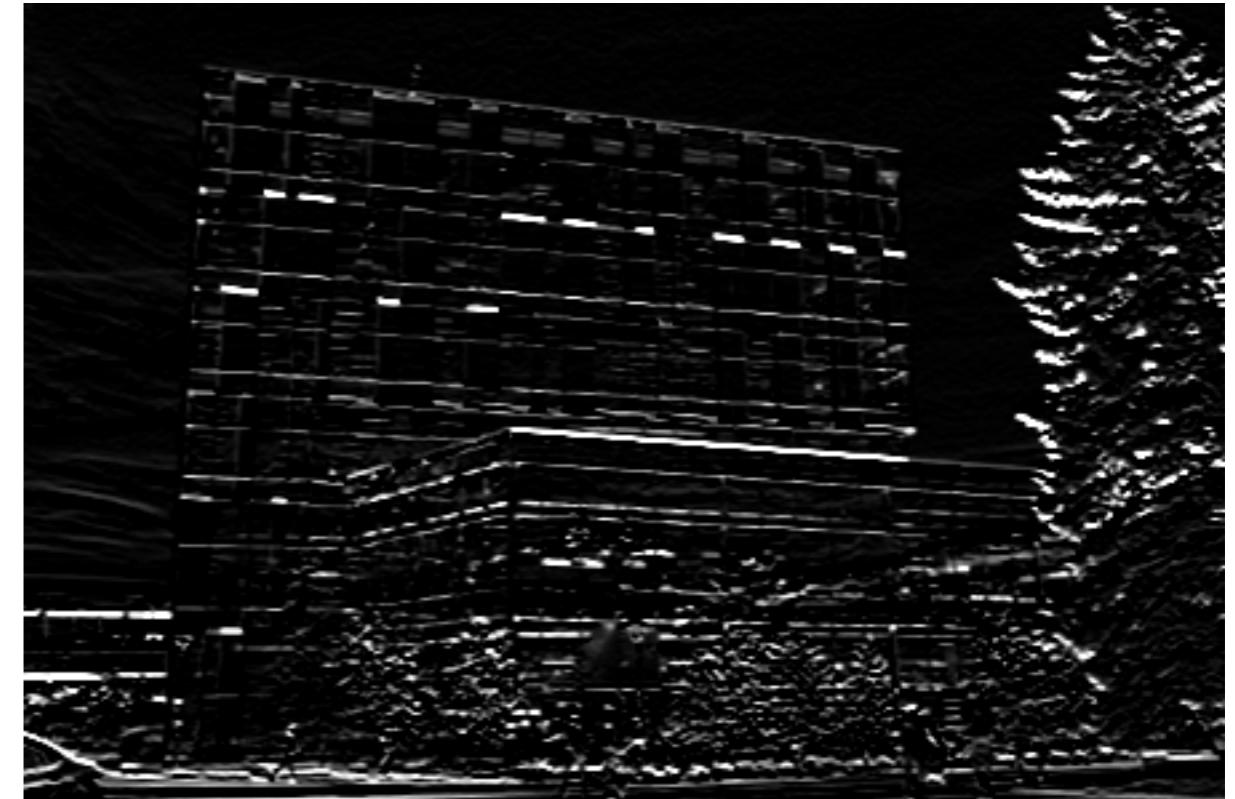
# Today's Outline

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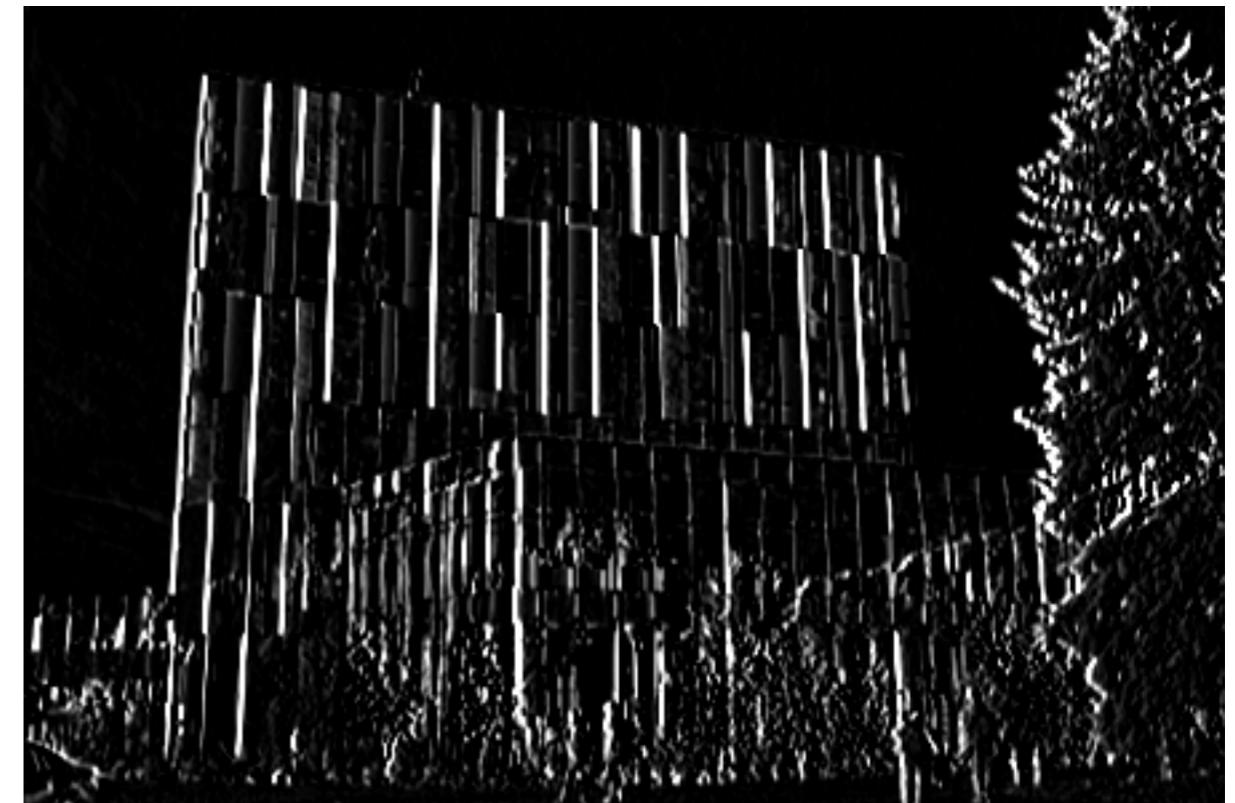
- Convolution Filters on Images
  - edge detection
  - smoothing
- Signal Reconstruction
  - interpolation, and how it do it perfectly
- Colour Conversion



original



horizontal edges

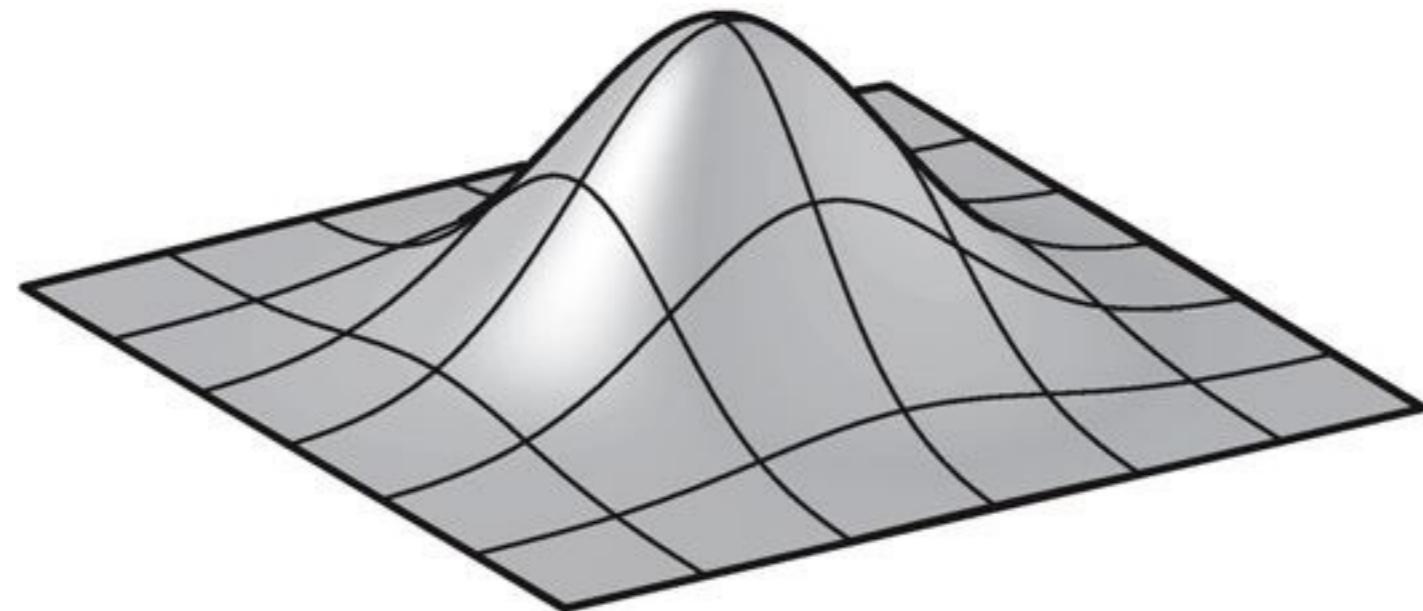


vertical edges

**What about  
blurring?**

# The 2D Gaussian Function

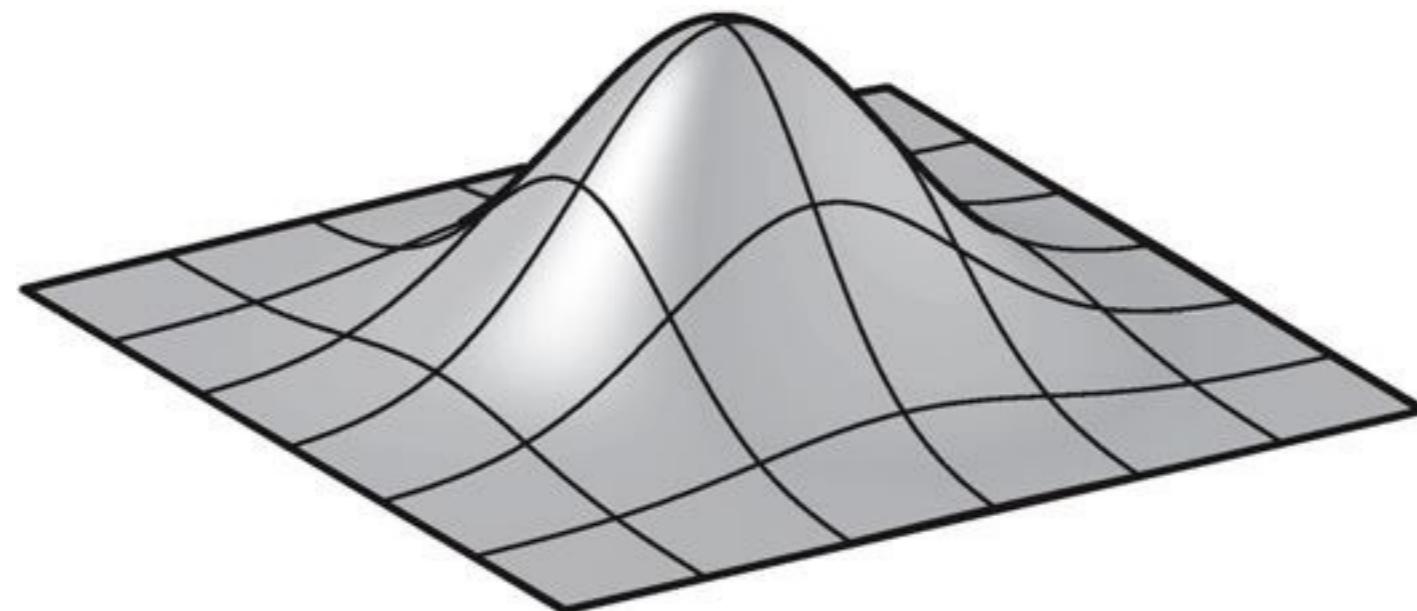
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$$G(x, y) = \frac{1}{2\pi\sigma^2} e^{-\frac{x^2+y^2}{2\sigma^2}}$$

# A Discrete 2D Gaussian

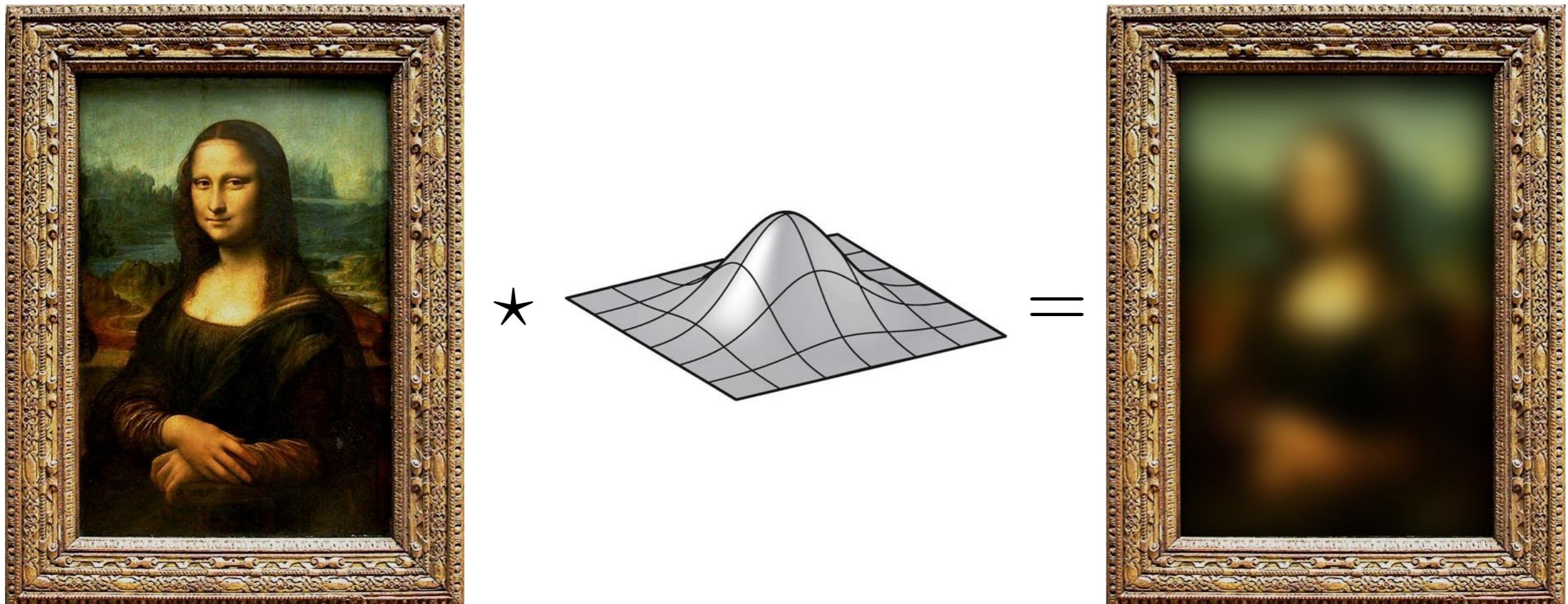
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$$G[i, j] = \begin{bmatrix} 0.04 & 0.12 & 0.04 \\ 0.12 & 0.36 & 0.12 \\ 0.04 & 0.12 & 0.04 \end{bmatrix}$$

# Convolution with a 2D Gaussian

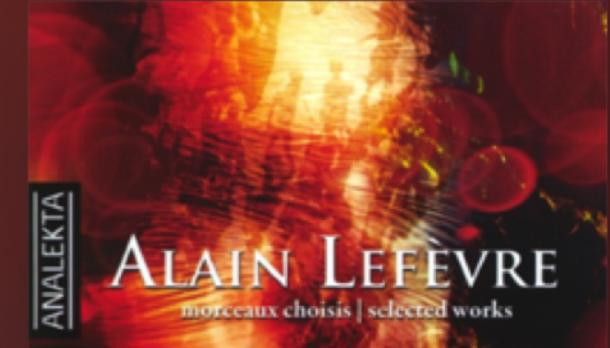
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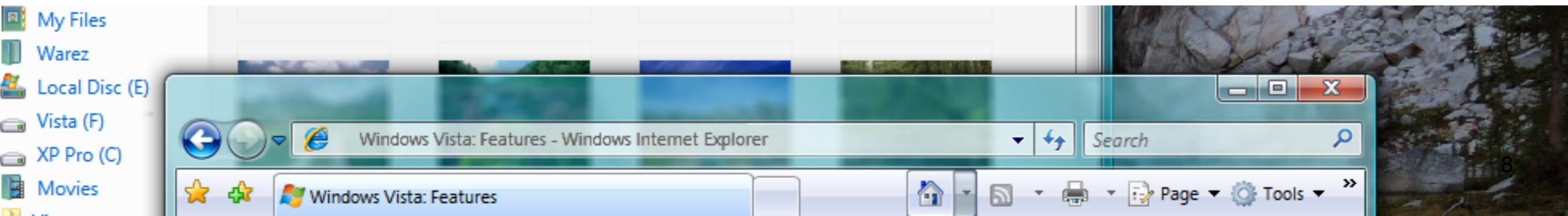
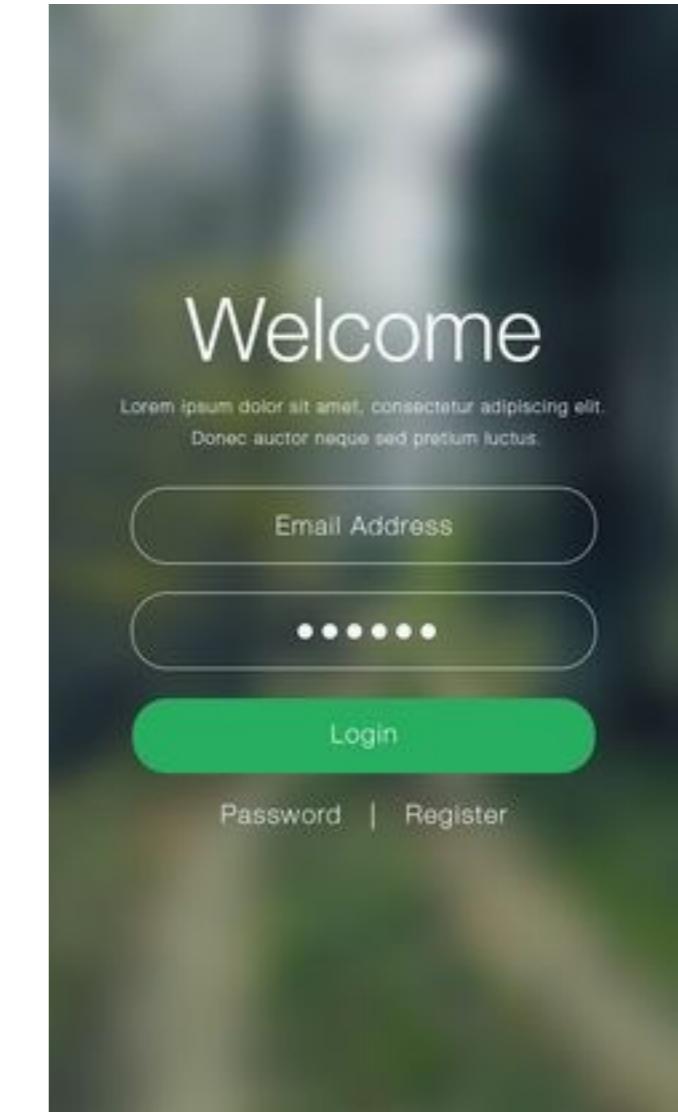
**Why would you ever want to do this???**



1 Concerto De Québec (piano solo)	10:06	6 Les Tableaux D'une Exposition - Gnomus	3:12
Alain Lefèvre		Alain Lefèvre	
2 Fugue En La Mineur pour orgue de J.S. Bach (BWV...)	6:20	7 Les Tableaux D'une Exposition - Il Vecchio Castello	5:11
Alain Lefèvre		Alain Lefèvre	
3 Prélude No. 5	3:45	8 Concerto De Varsovie	9:29



Because it  
looks cool!



# Anti-Aliasing in 2D

---

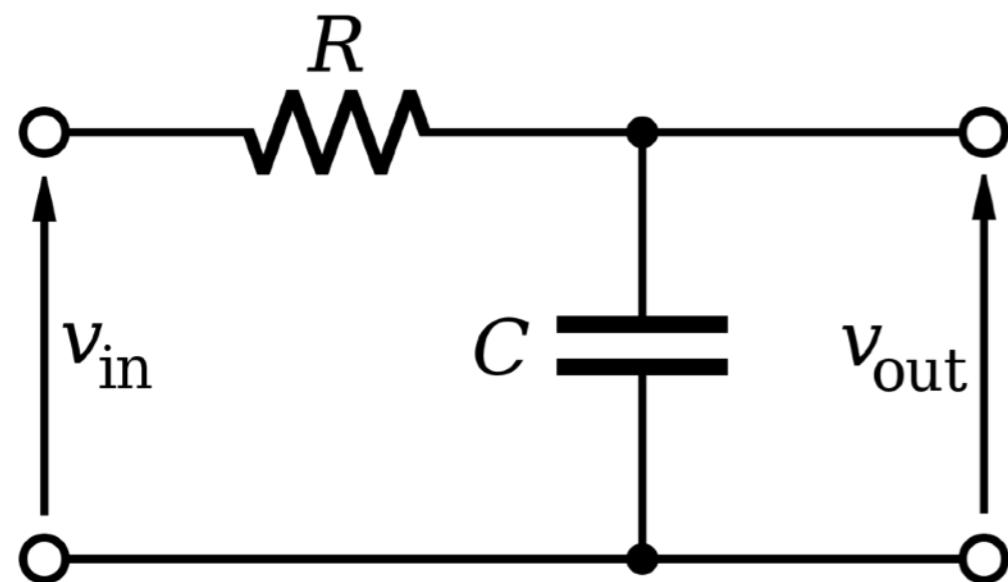
How does it work?



**No jaggies!**

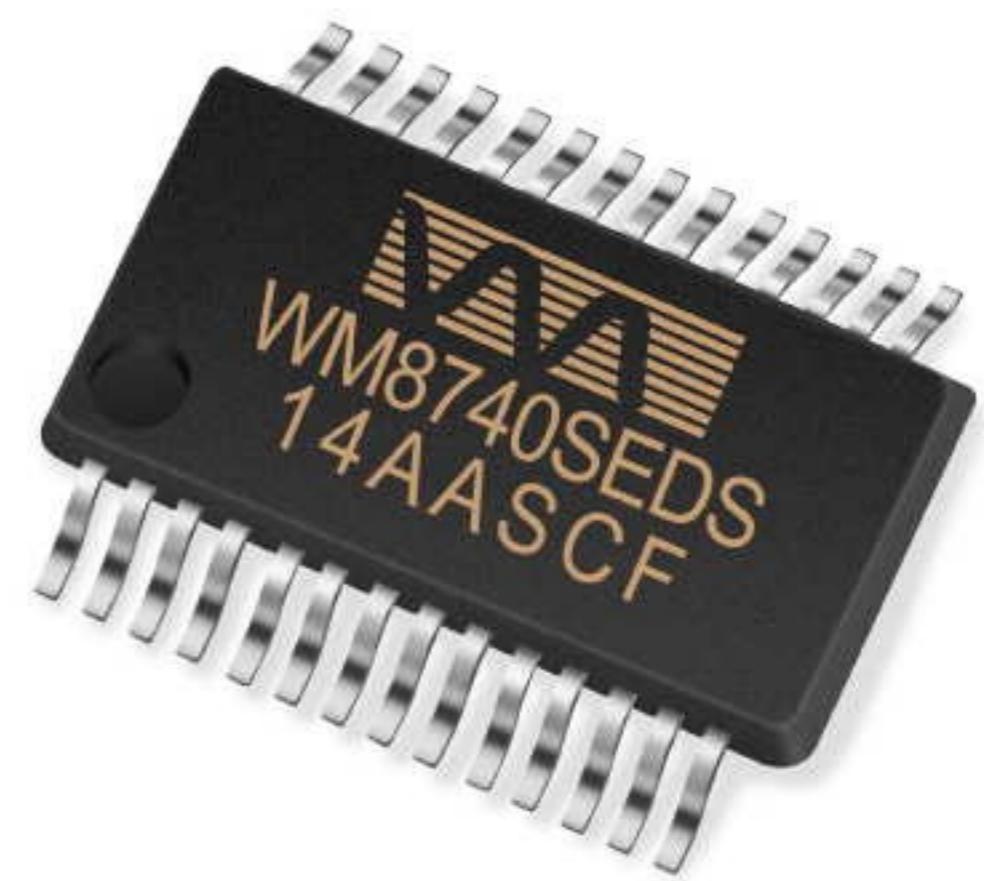
# Anti-Aliasing in 2D

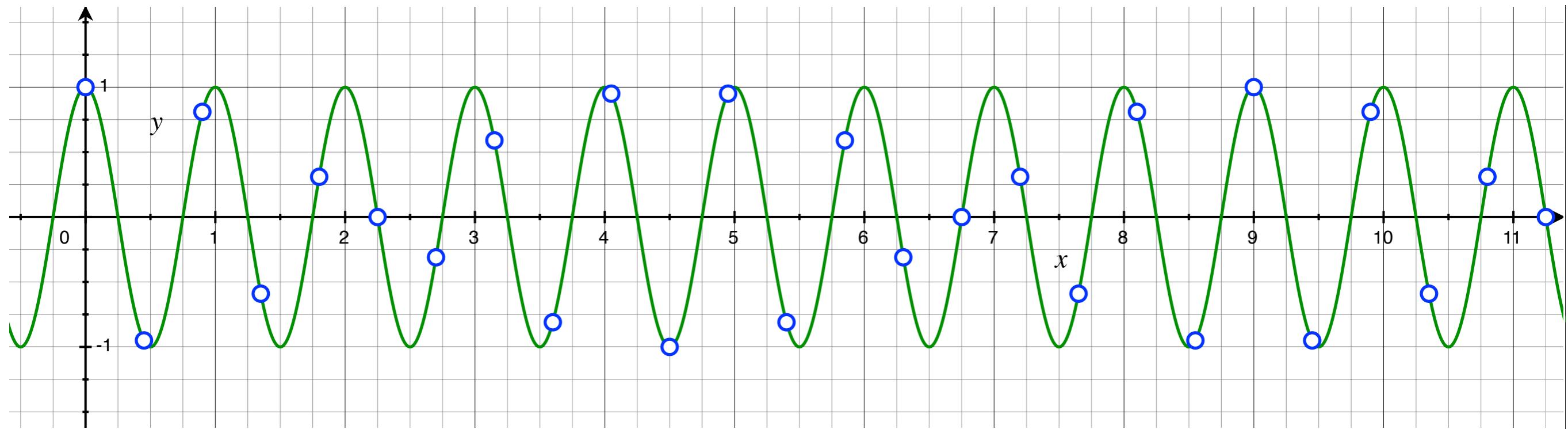
How does it work?



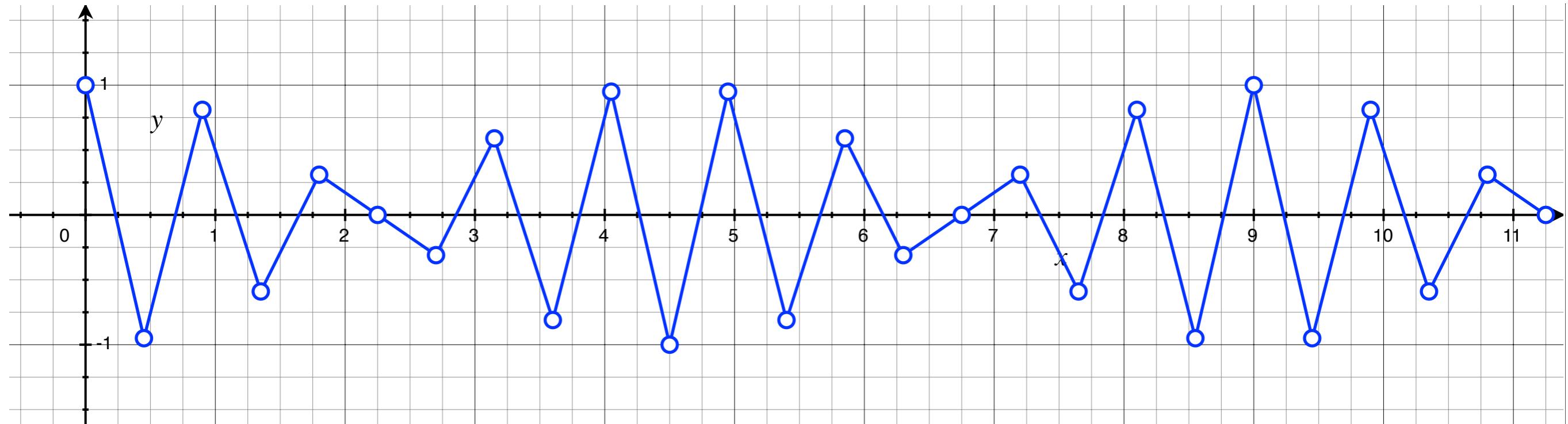
**No jaggies!**

# Signal Reconstruction





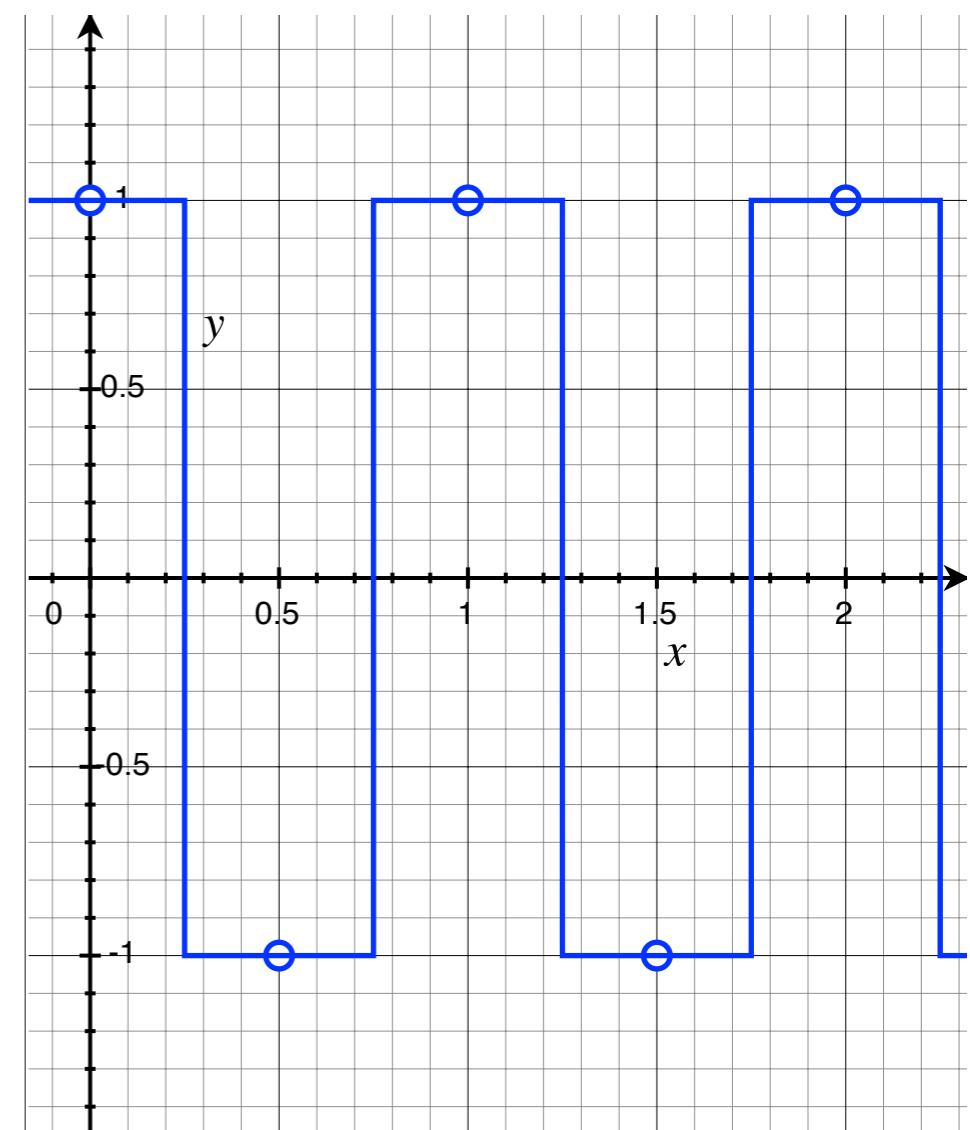
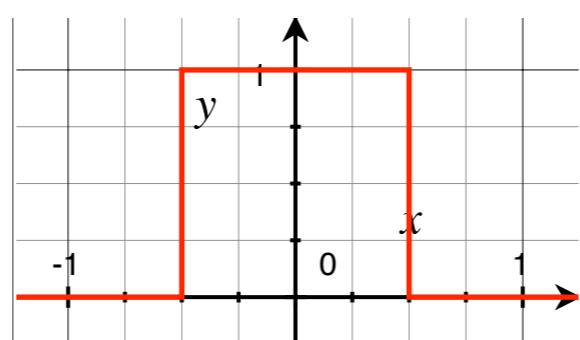
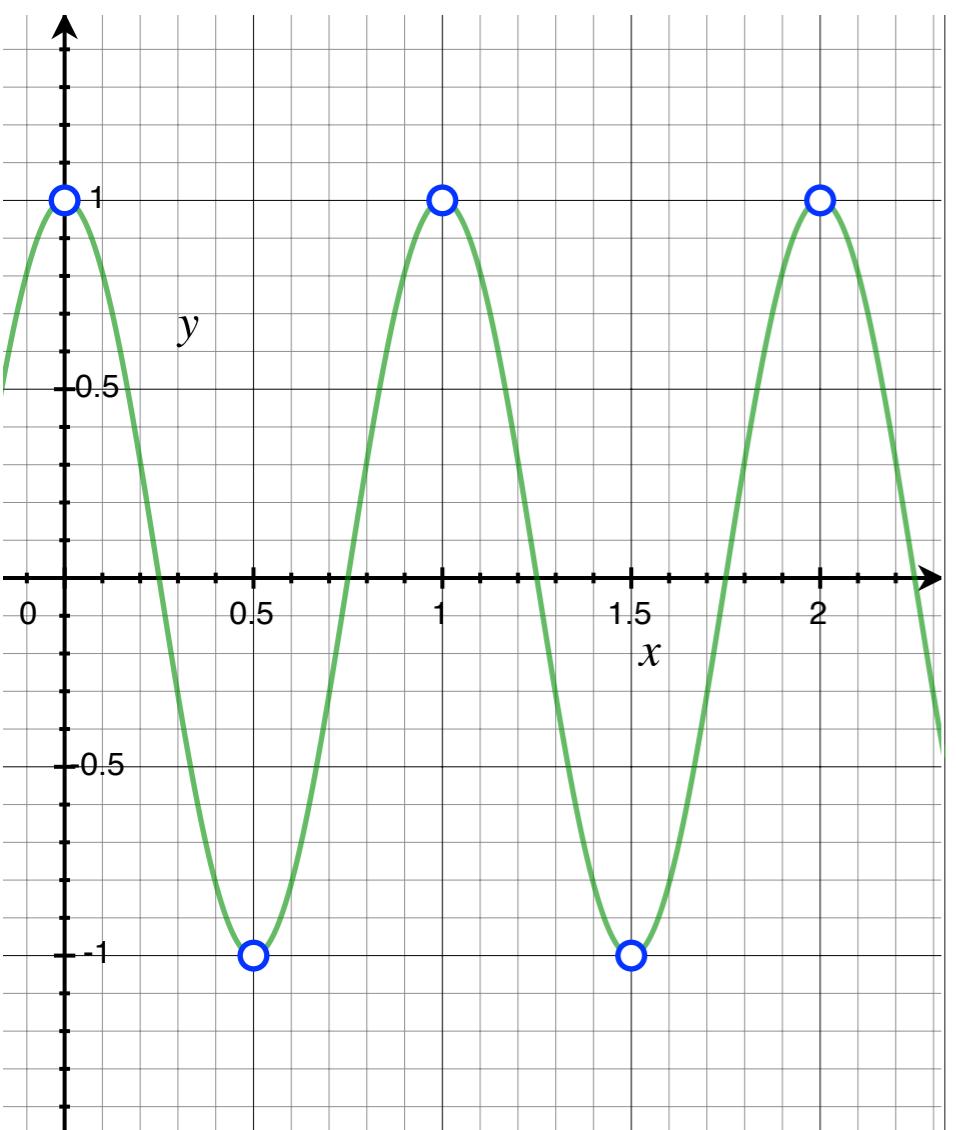
**Let's see if we can shed some light on this problem...**



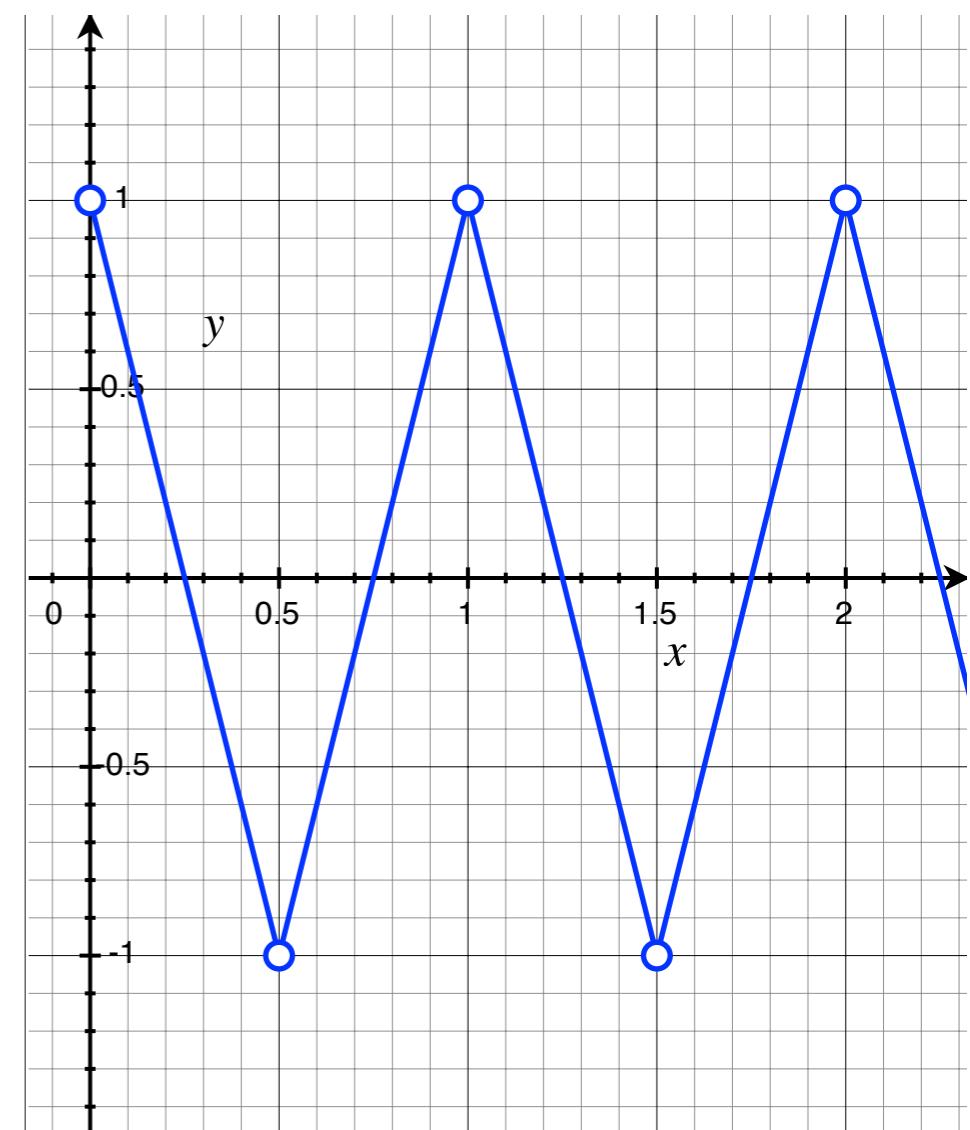
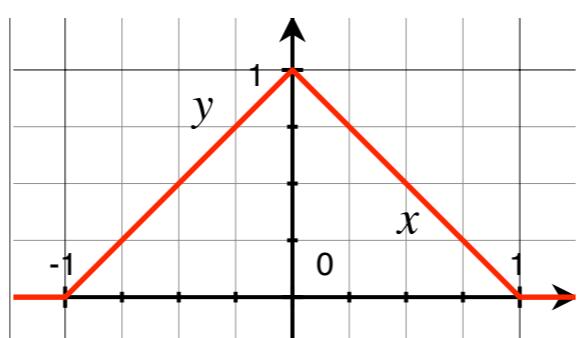
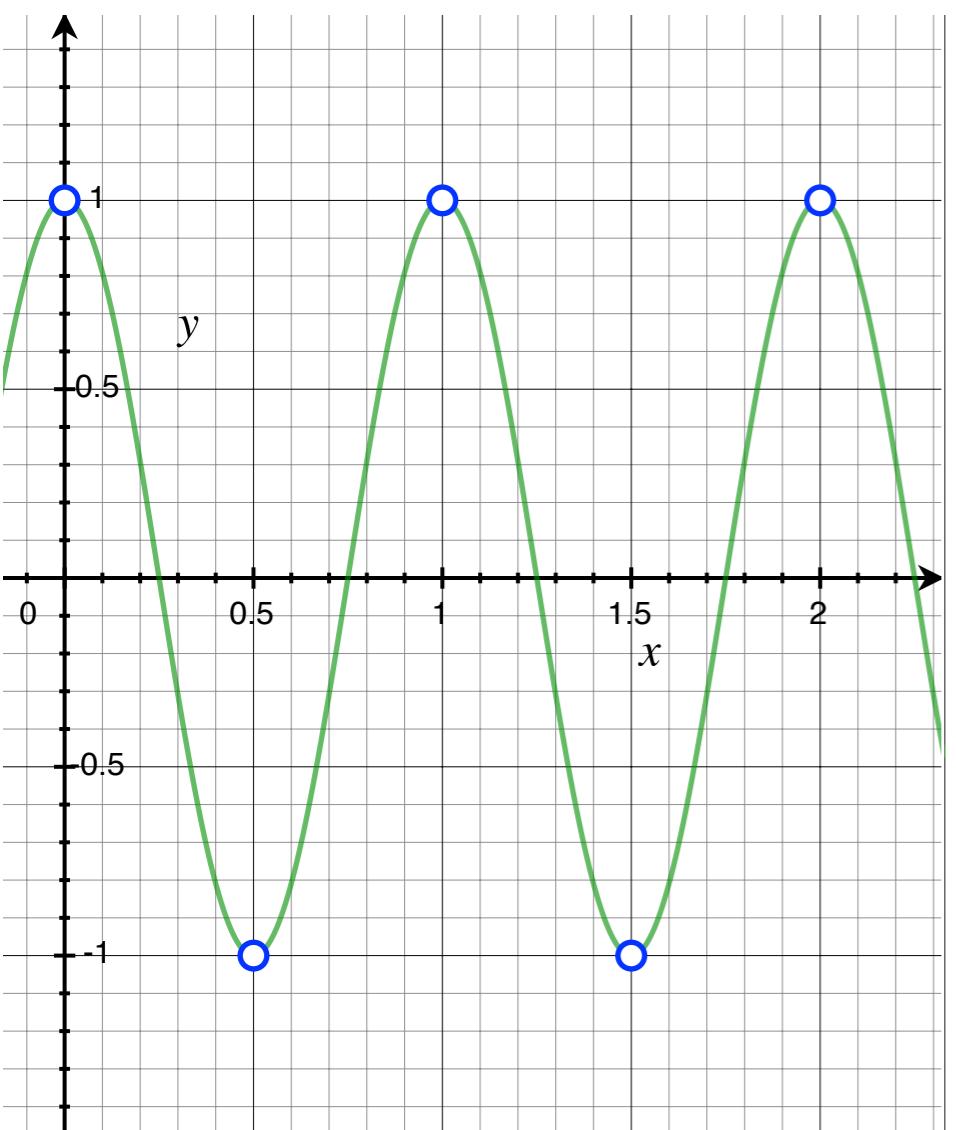
To **faithfully** reconstruct a band-limited signal from its samples, the sampling rate must be at least twice that of its highest frequency component.

**-Shannon Sampling Theorem, or *Nyquist Frequency***

**Interpolation  
is  
Convolution**



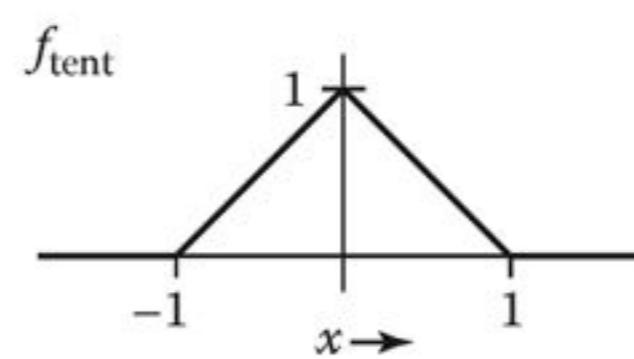
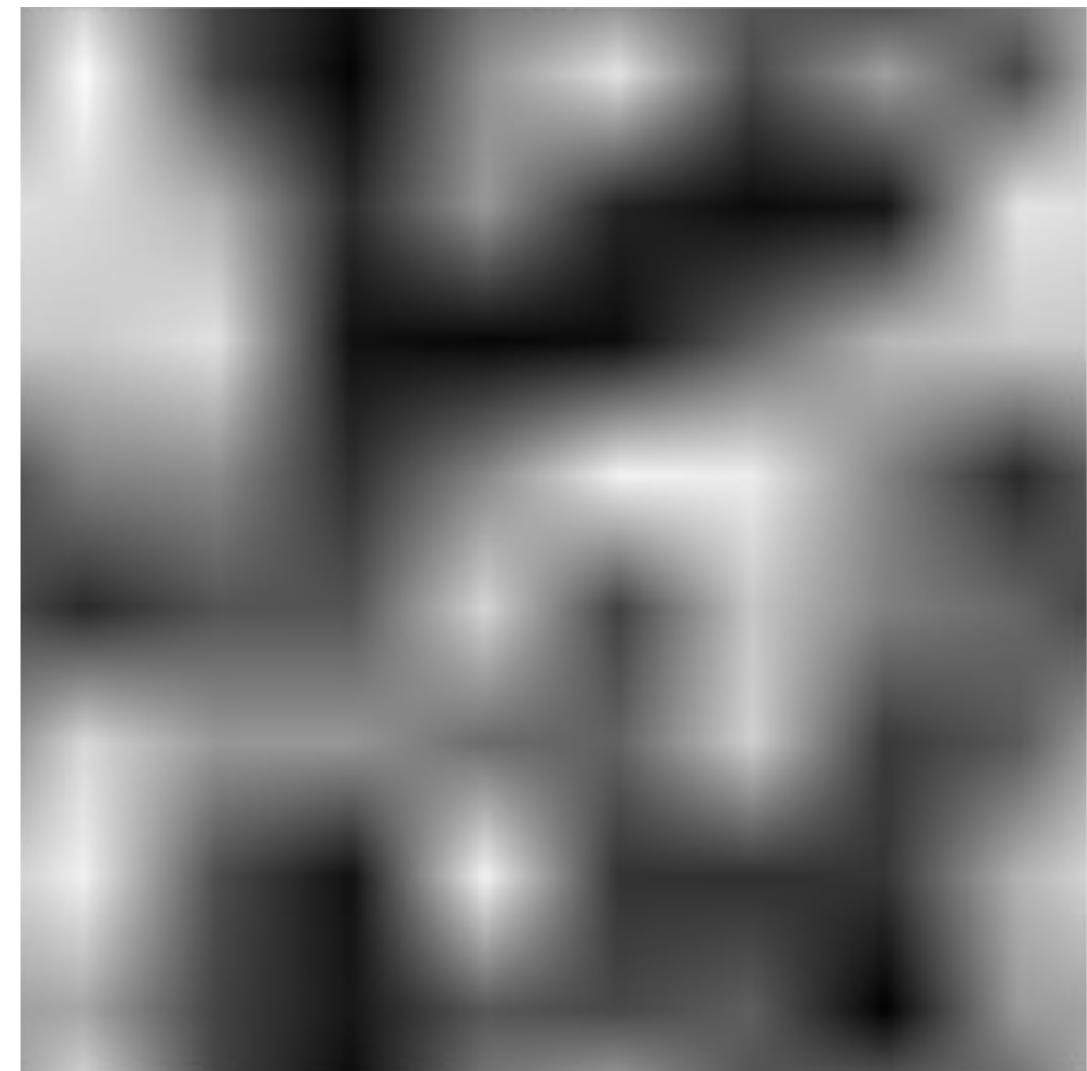
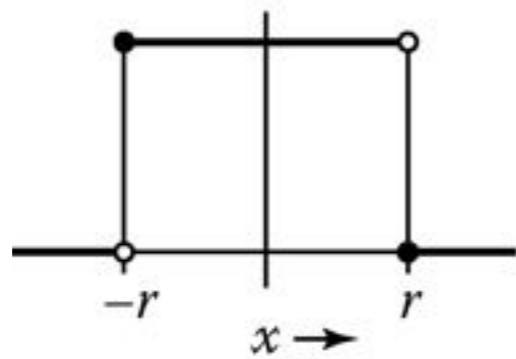
“nearest neighbour” interpolation

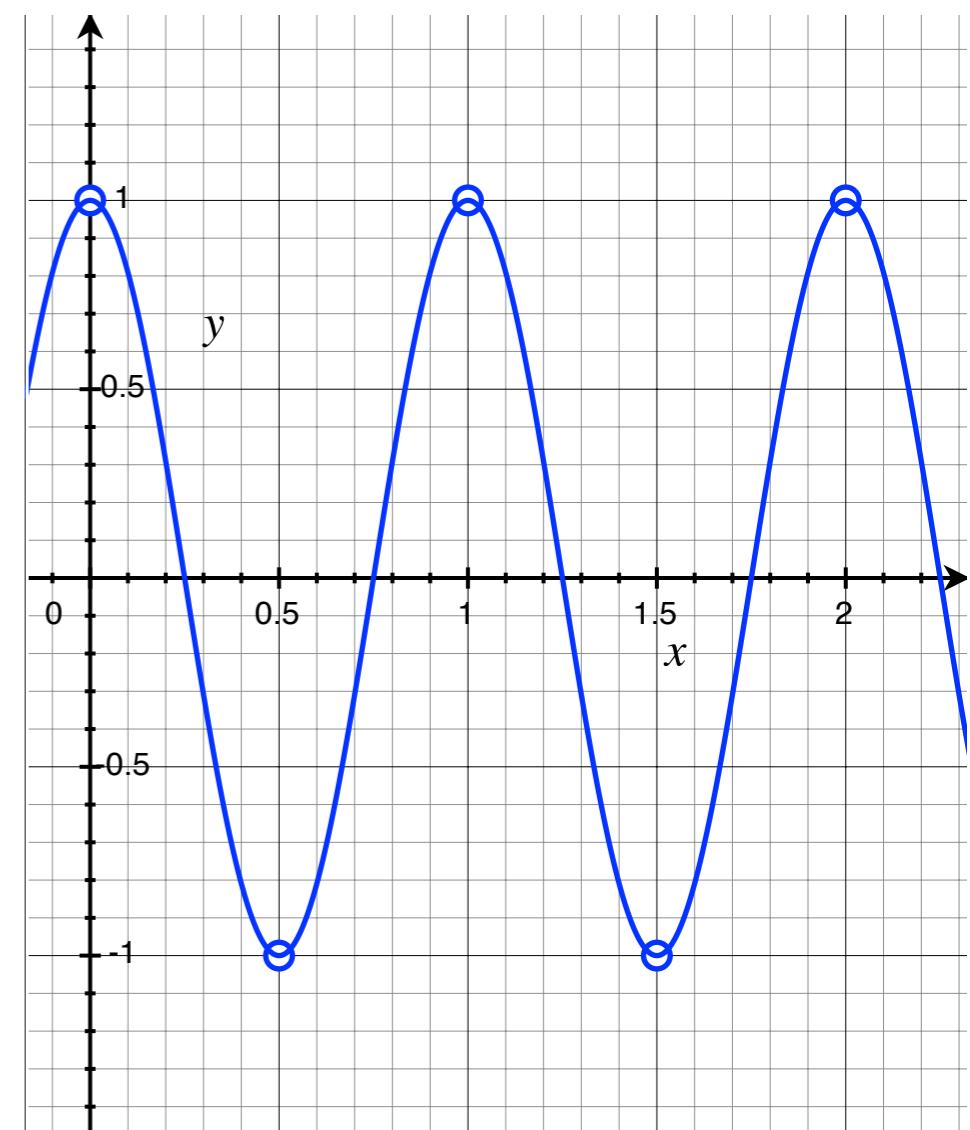
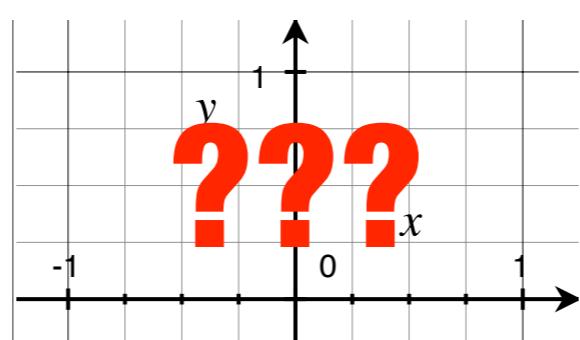
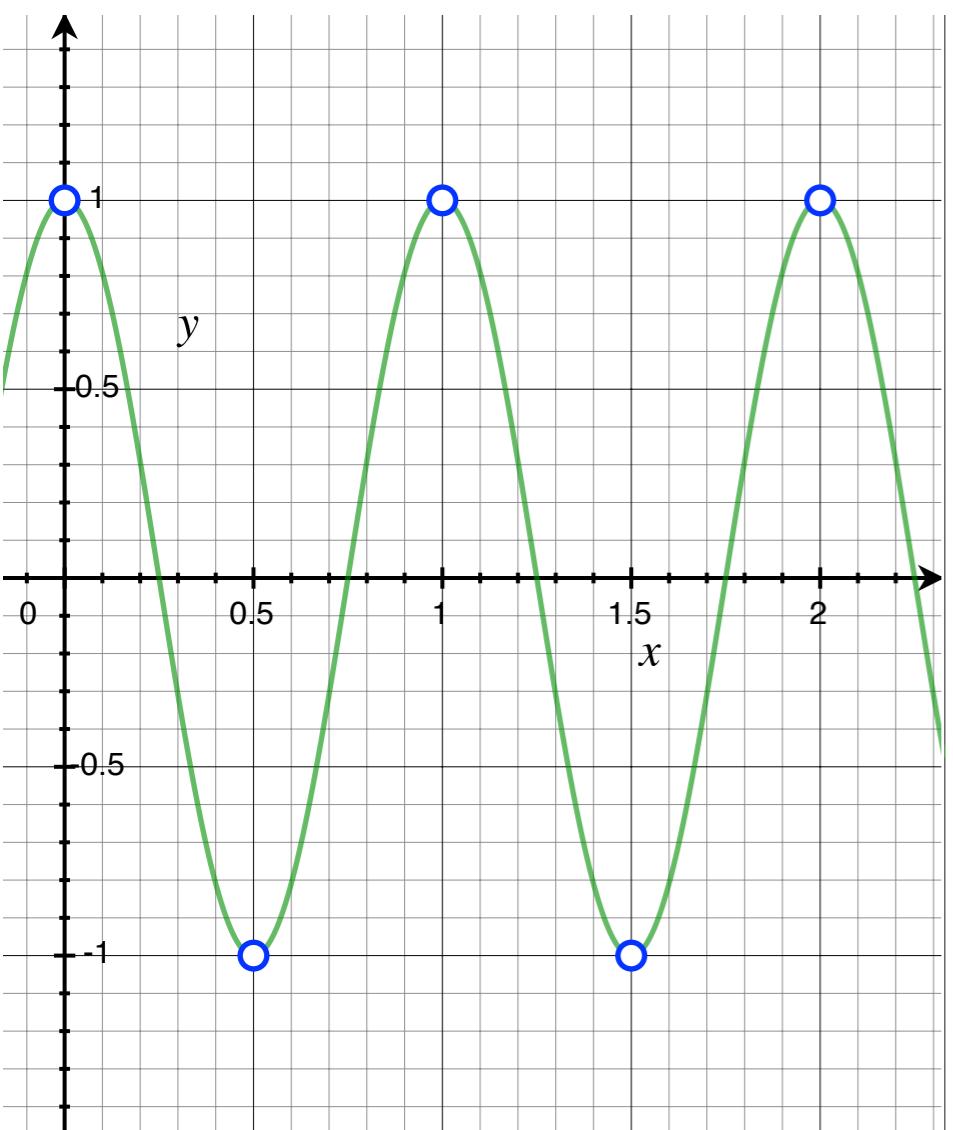


linear interpolation

# In Two Dimensions

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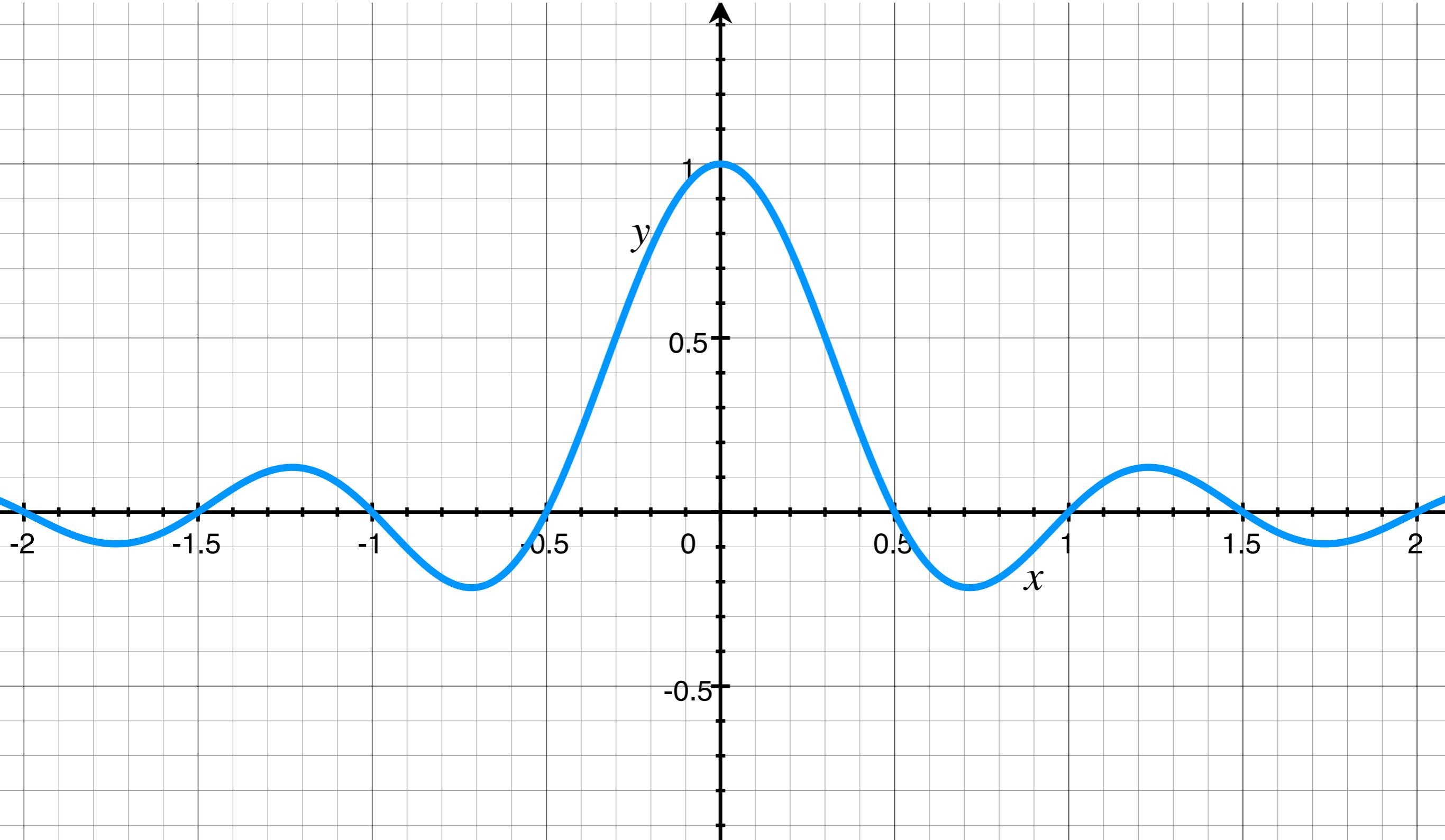
How do we get a “faithful” reconstruction?



EXIT

ENTRANCE



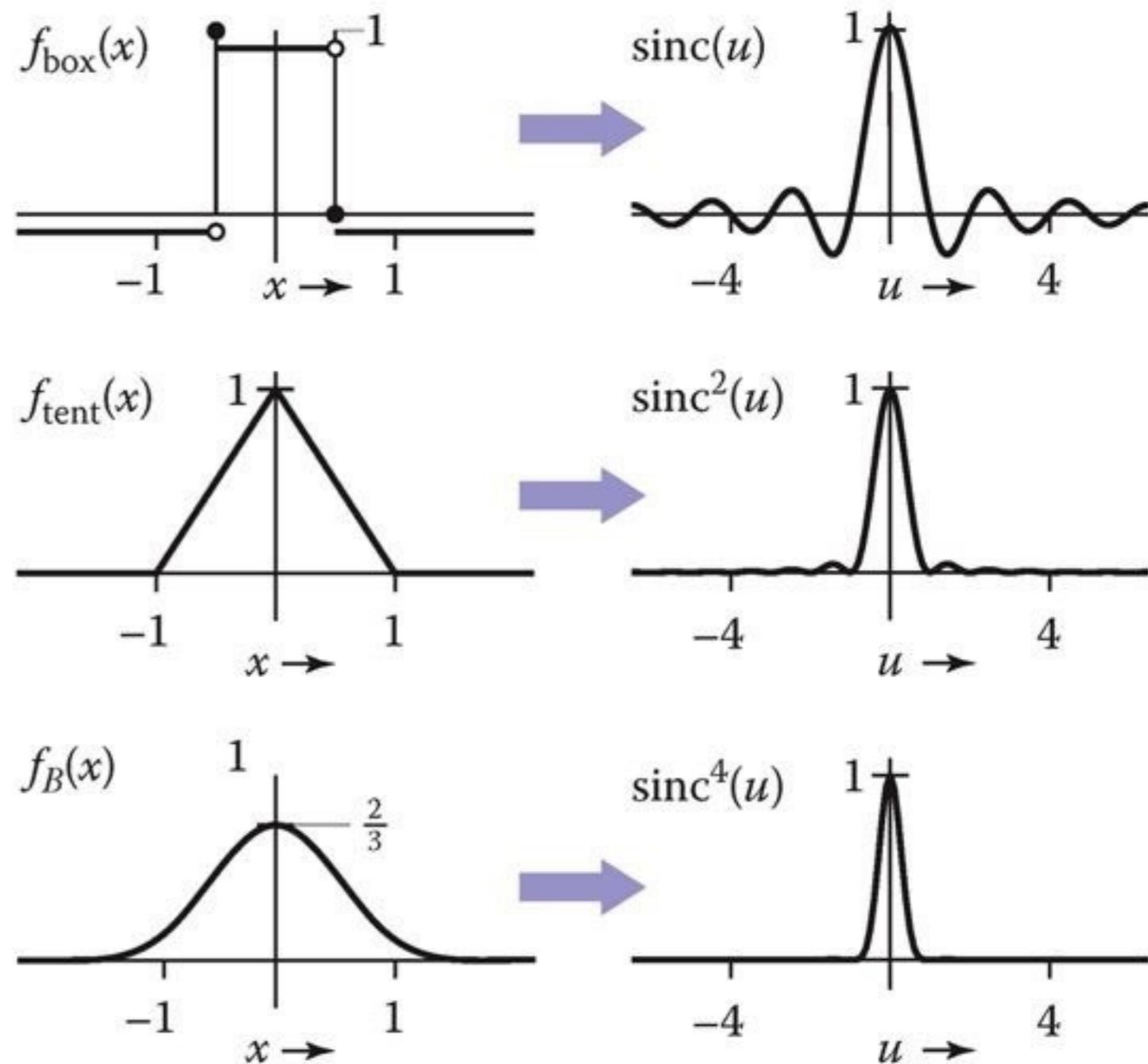


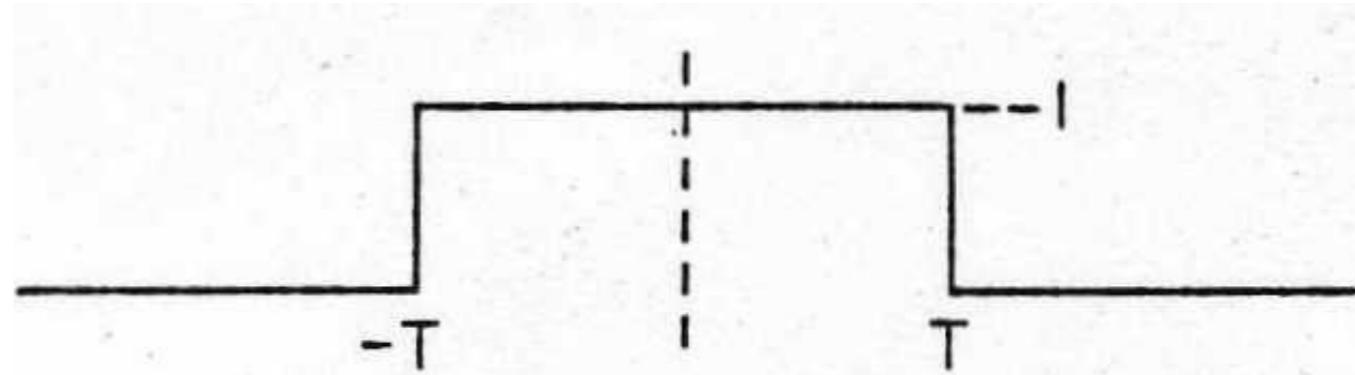
The sinc function

$$\text{sinc}(x) = \frac{\sin x}{x}$$

# Reconstruction Filters

Frequency Content

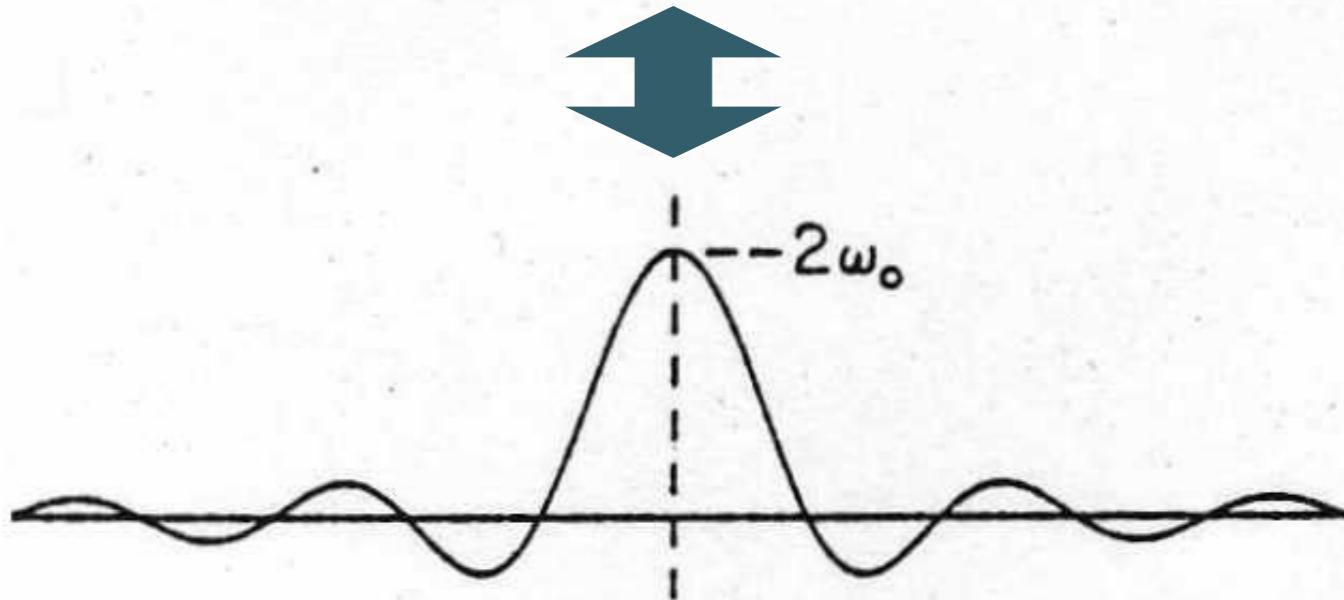




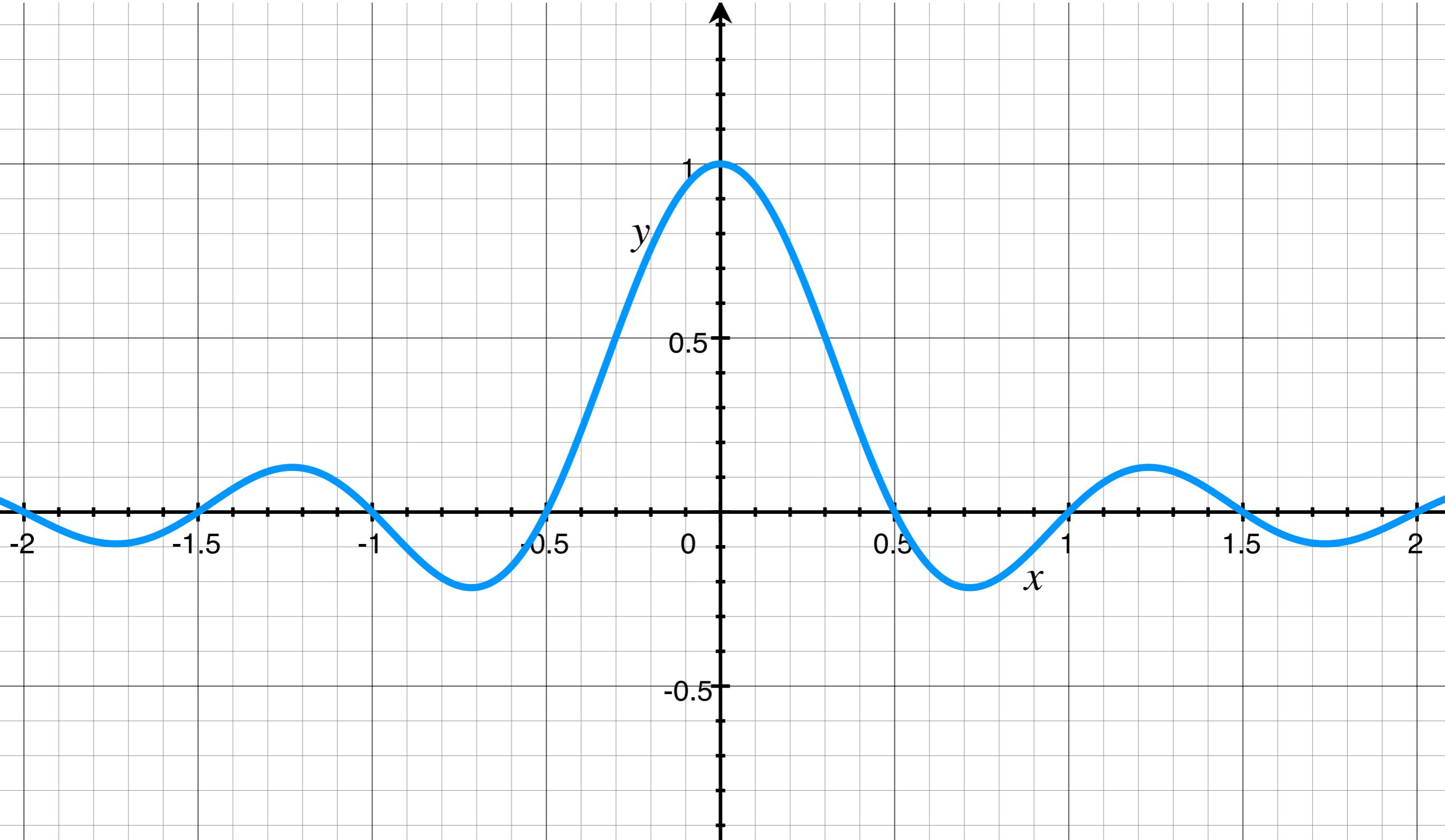
$$f(t) = \begin{cases} 1 & -T < t < T \\ 0 & \text{otherwise} \end{cases}$$

## Frequency of sinc

The Fourier Transform and its inverse are symmetric!



$$f(t) = 2\omega_0 \sin(\omega_0 t) / (\omega_0 t)$$

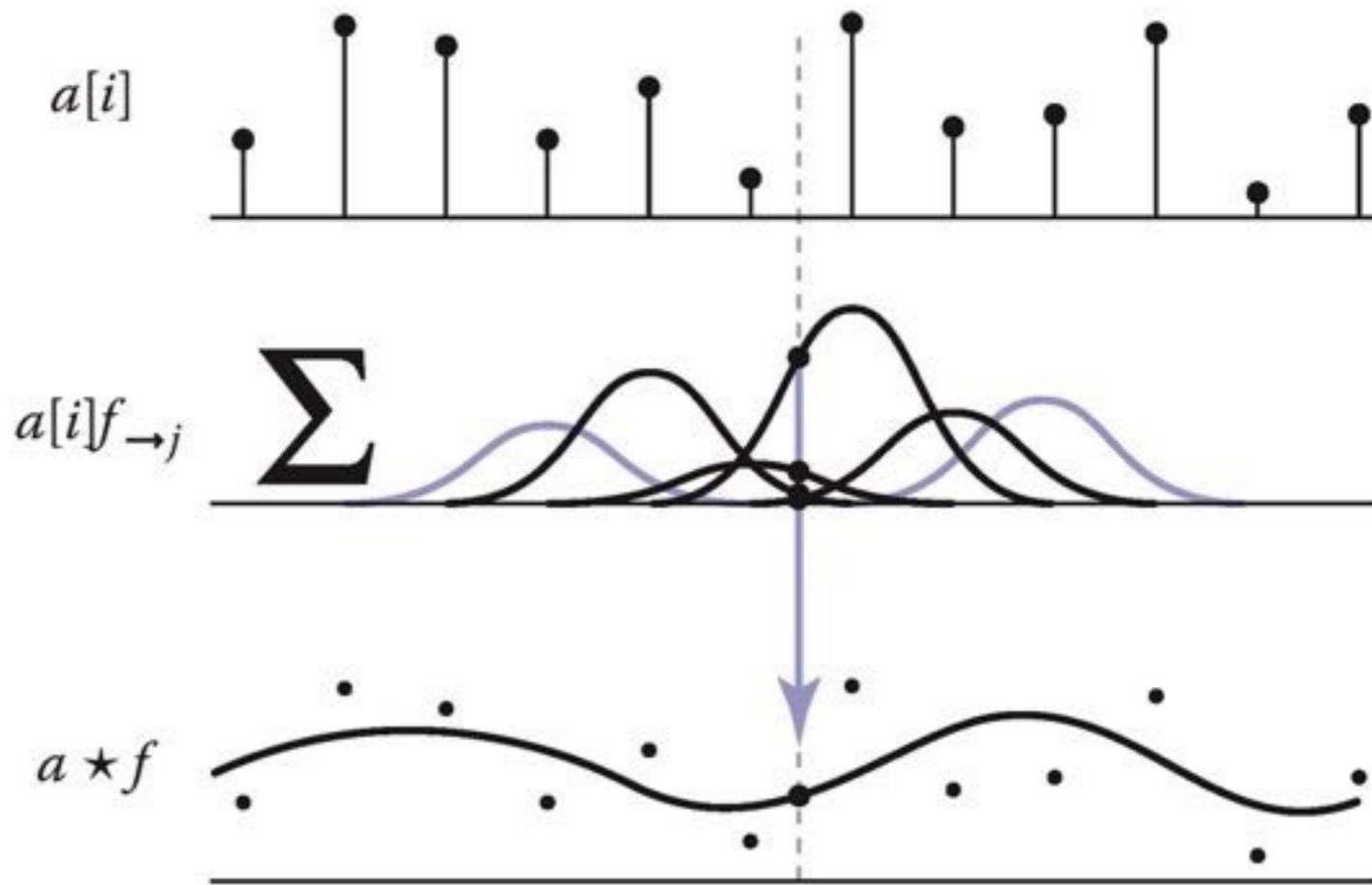


Perfect Reconstruction

$$a[i] \star \text{sinc}(x)$$

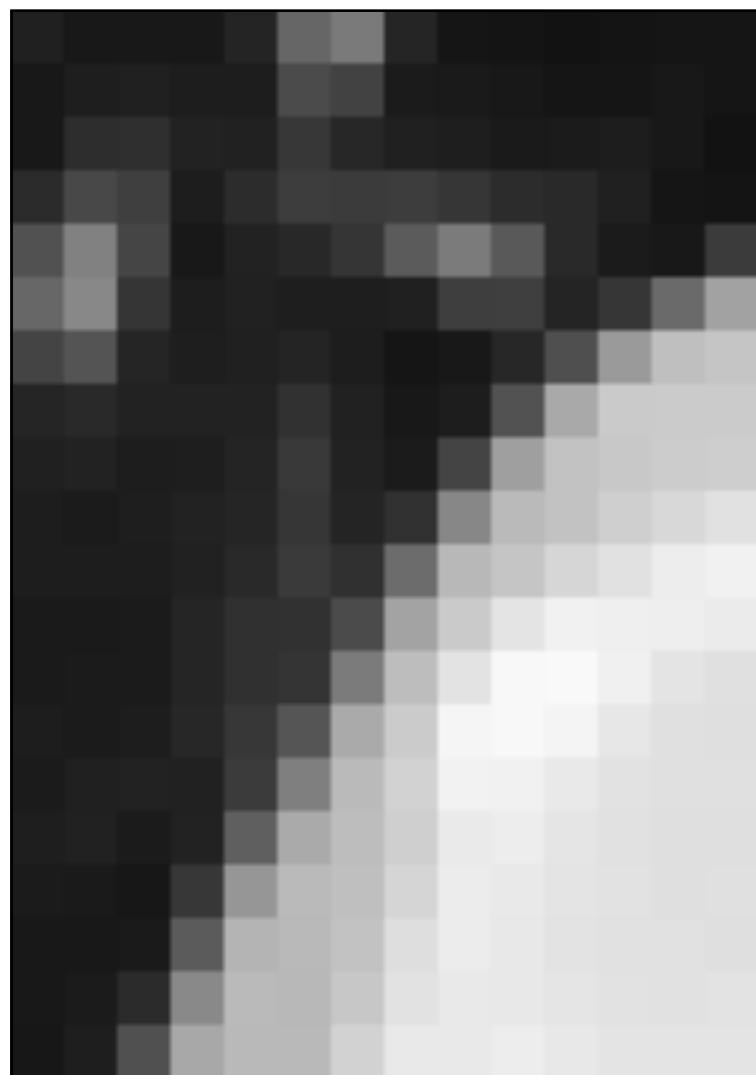
# Signal Reconstruction

by convolution with reconstruction  
kernel (e.g. cubic spline)



# Perfect Reconstruction?

---



nearest

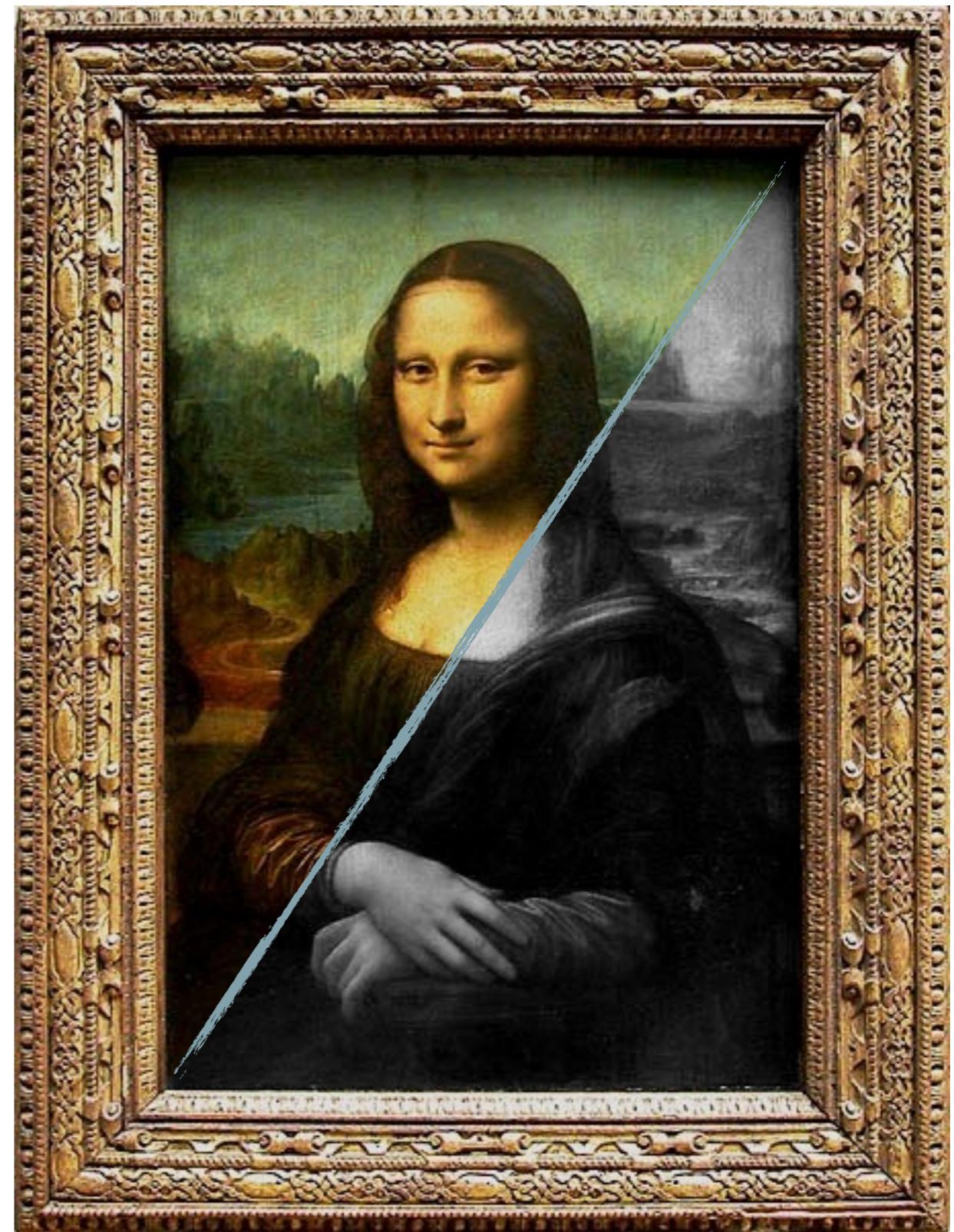


linear



sinc

# Colour Conversion



# Colour Images

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- A sampled colour image maps integer pairs to three colour channels:

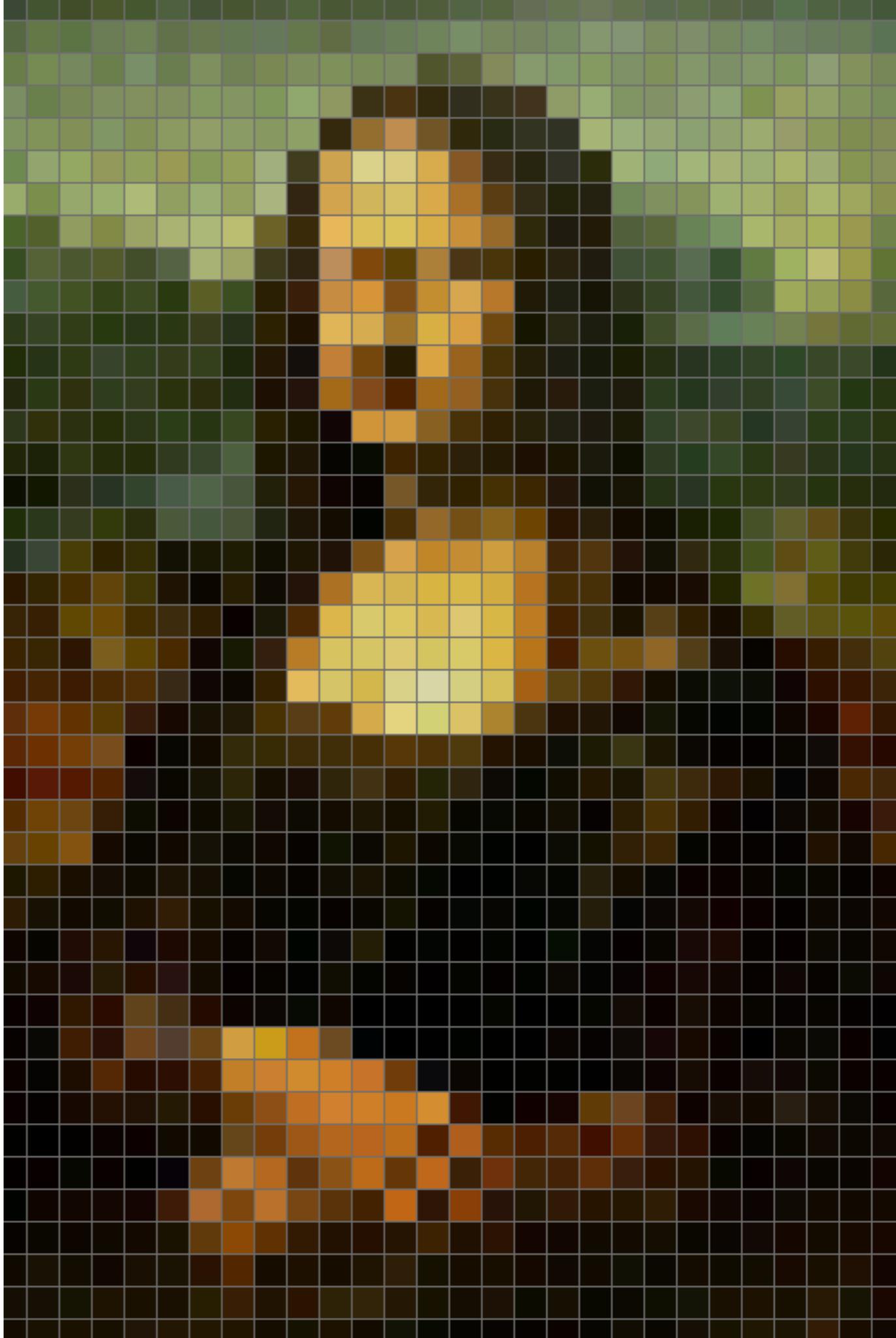
$$I[i, j] : \mathbb{Z}^2 \mapsto \mathbb{R}^3$$

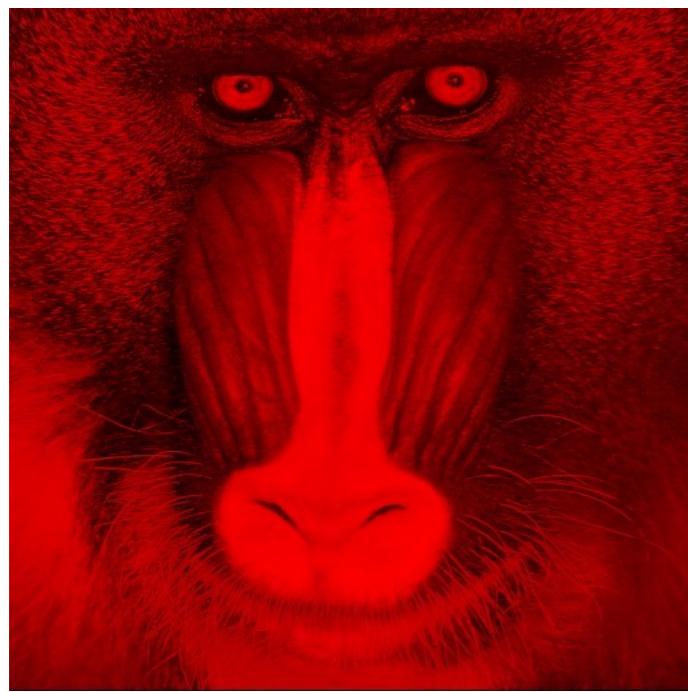
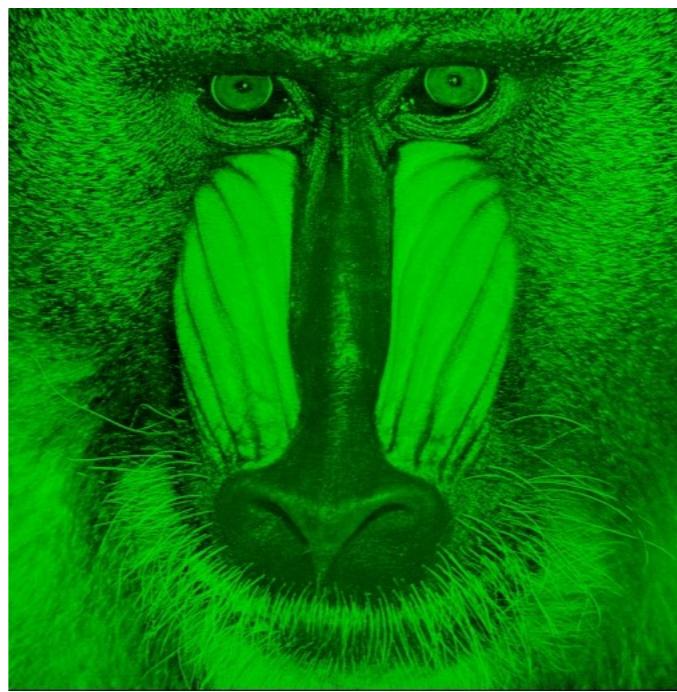
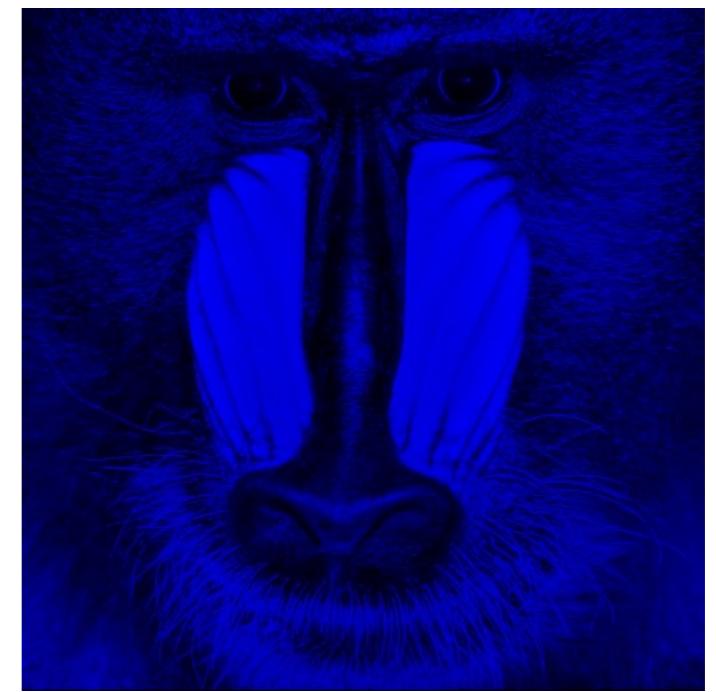
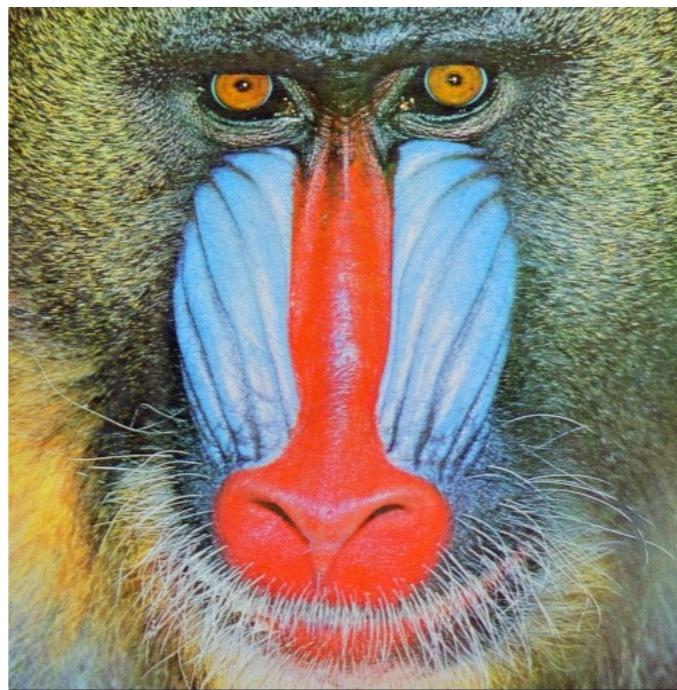
- We can consider each colour as a separate function to apply filters:

$$R[i, j] : \mathbb{Z}^2 \mapsto \mathbb{R}$$

$$G[i, j] : \mathbb{Z}^2 \mapsto \mathbb{R}$$

$$B[i, j] : \mathbb{Z}^2 \mapsto \mathbb{R}$$



 $R[i, j]$  $G[i, j]$  $B[i, j]$ 

Or maybe we can average the channels?

---





Which one is “correct”?

# Which greyscale do you see?

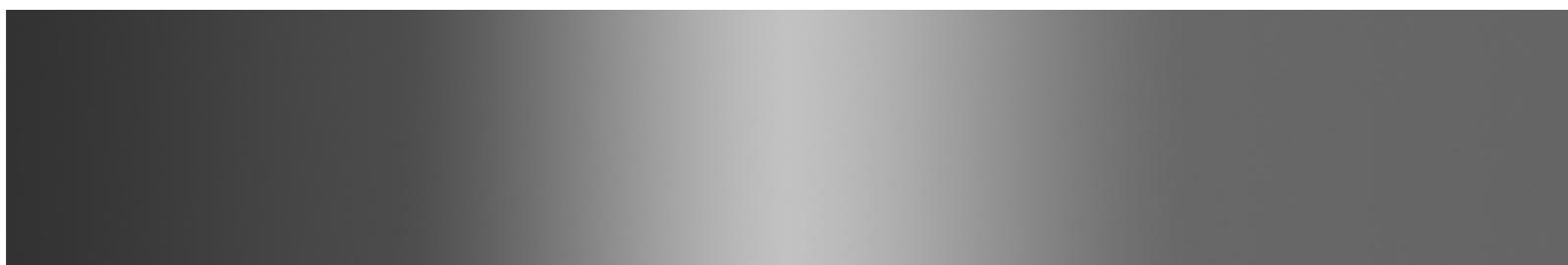
---



**Average**



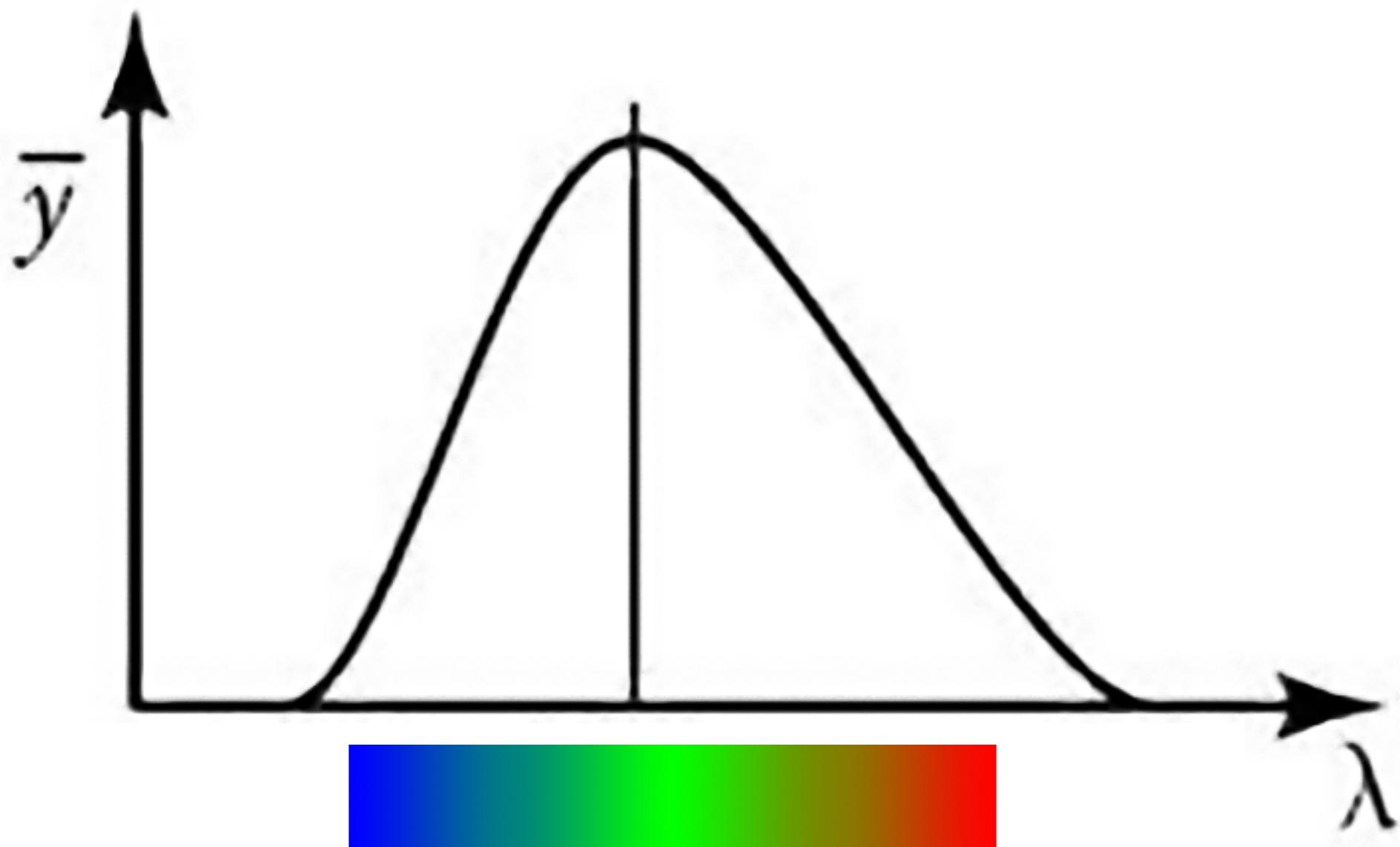
**Original**



**Perceptual**

# Recall Luminous Efficiency

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# Things to Remember

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- Convolution is used for many important things:
  - dazzling image effects
  - low-pass filter for anti-aliasing
- Interpolation is convolution
  - perfect signal reconstruction is convolution with sinc
- Don't simply average colours to get a greyscale image!

Let's talk a bit about  
**vectors!**