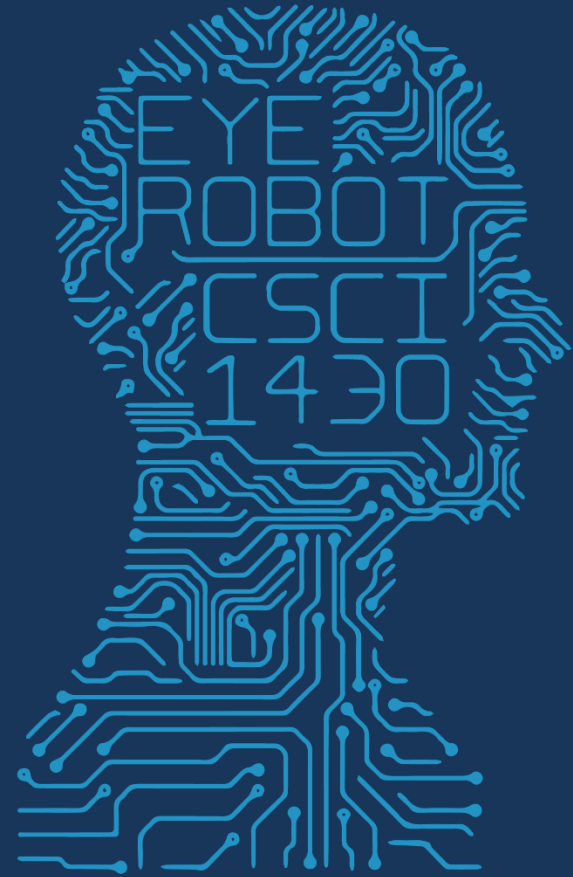


1950

FUTURE VISION



2017 MWF 1PM

COMPUTER VISION







# Waitlist

- We'll let you know as soon as we can.
- Biggest issue is TAs

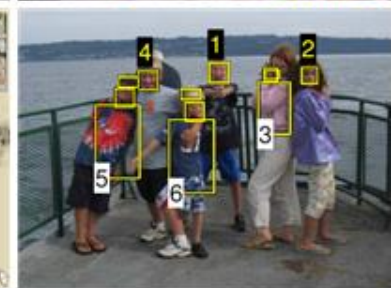
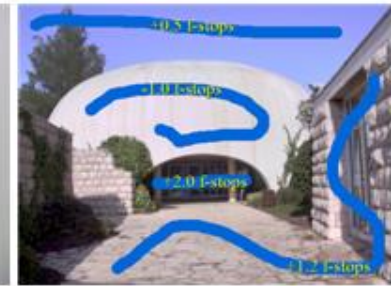
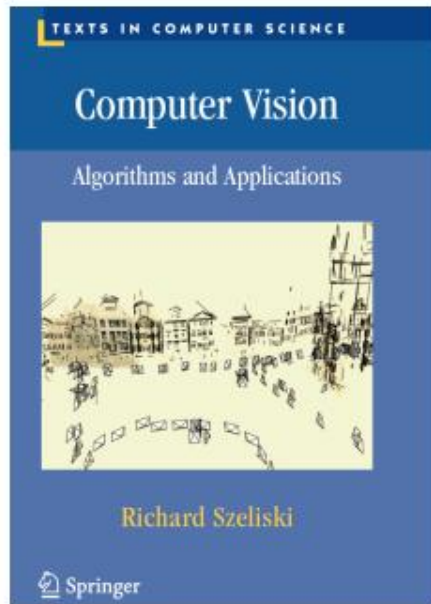
# CS 143 – James Hays

- Many materials, courseworks, based from him + previous TA staff – serious thanks!

# Textbook

## Computer Vision: Algorithms and Applications

© 2010 [Richard Szeliski](http://szeliski.org/Book/), Microsoft Research



<http://szeliski.org/Book/>



# Textbook



## Deep Learning

**An MIT Press book**

**Ian Goodfellow and Yoshua Bengio and Aaron Courville**

- Can I get a PDF of this book?

No, our contract with MIT Press forbids distribution of too easily copied electronic formats of the book.

- Why are you using HTML format for the web version of the book?

This format is a sort of weak DRM required by our contract with MIT Press. It's intended to discourage unauthorized copying/editing of the book.

- What is the best way to print the HTML format?

Printing seems to work best printing directly from the browser, using Chrome. Other browsers do not work as well.

# Class experience

- Linear algebra
- Probability
- Graphics course?
- Vision/image processing course before?
- Machine learning?



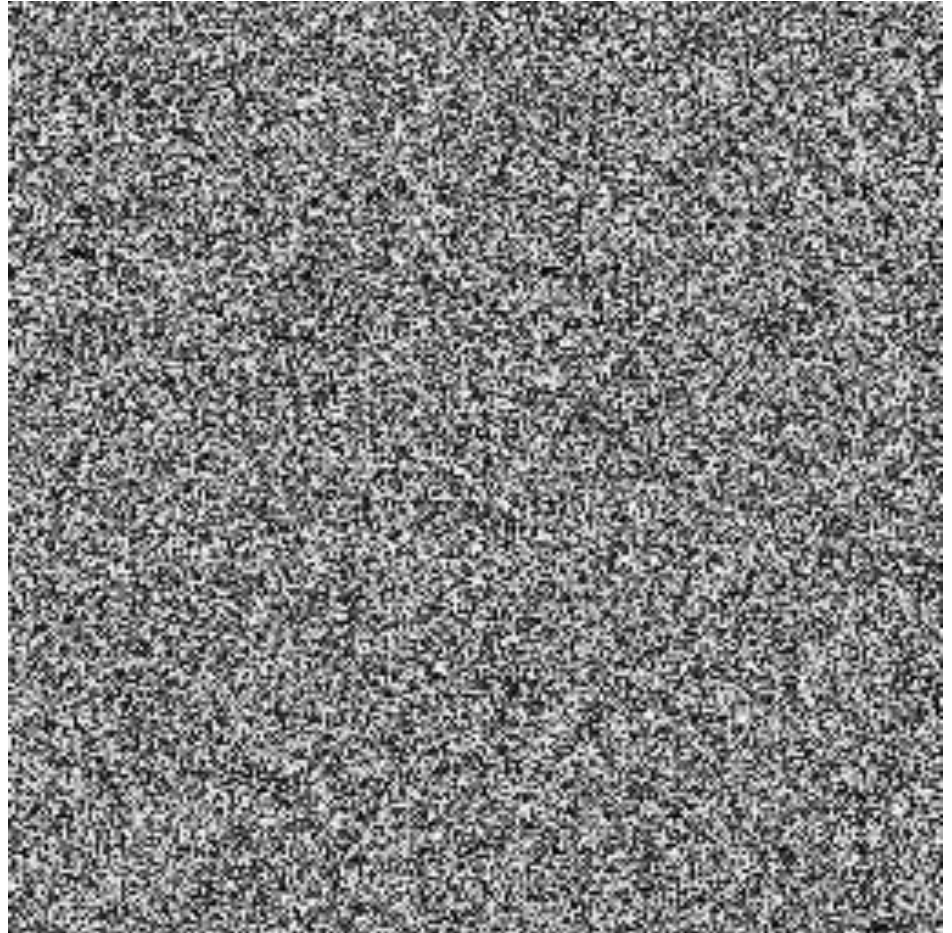
**WHAT IS AN IMAGE?**

```
>> I = rand(256,256);
```

Think-Pair-Share:

- What is this? What does it look like?
- Which values does it take?
- How many values can it take?
  
- Is it an image?

```
>> I = rand(256,256);  
>> imshow(I);
```



# Dimensionality of an Image

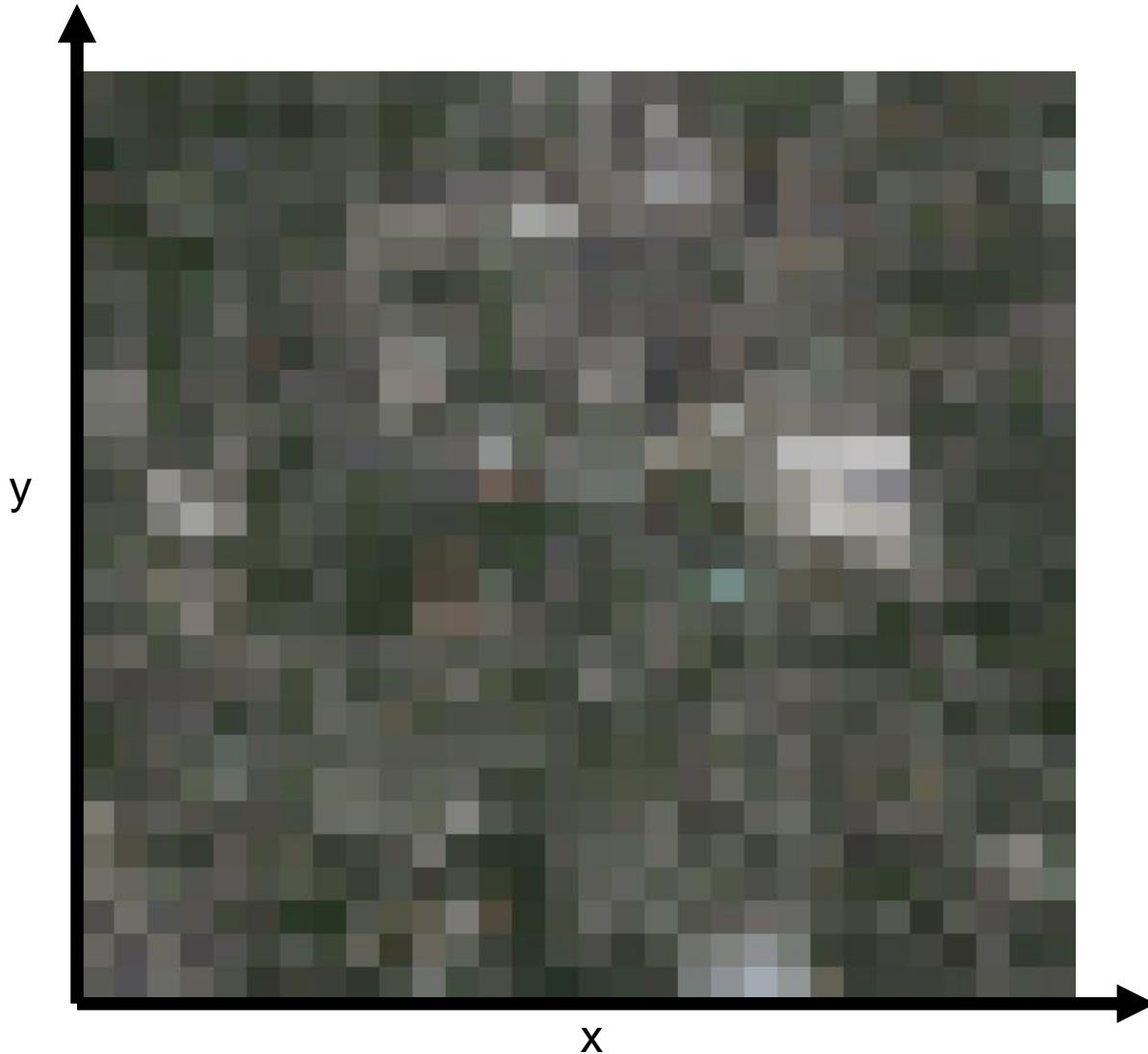
- @ 8bit = 256 values ^ 65,536
  - Computer says 'Inf' combinations.
- Some depiction of all possible scenes would fit into this memory.



# Dimensionality of an Image

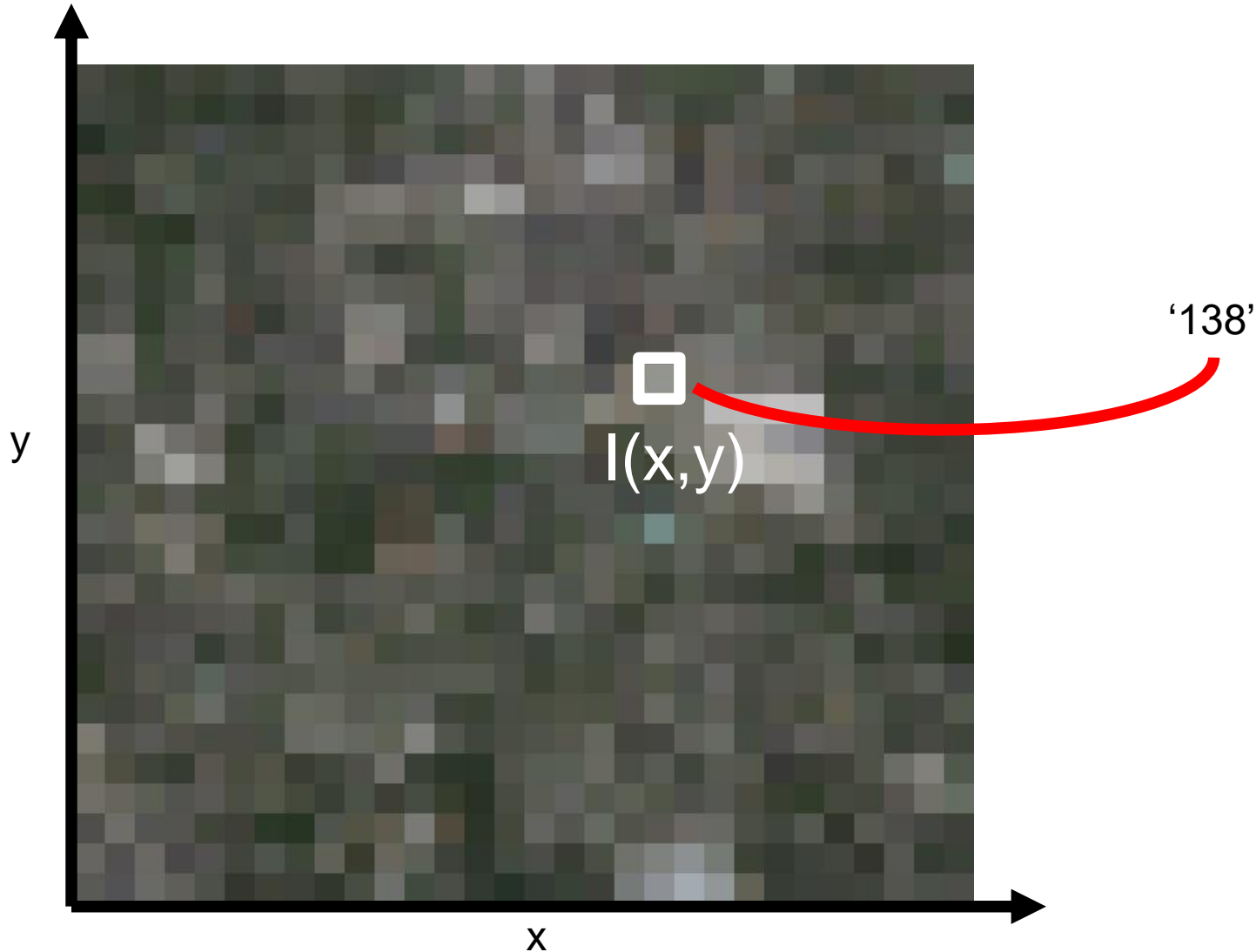
- @ 8bit = 256 values  $\wedge$  65,536
  - Computer says 'Inf' combinations.
- Some depiction of all possible scenes would fit into this memory.
- Computer vision as making sense of an extremely high-dimensional space.
  - Subspace of 'natural' images.
  - Deriving low-dimensional, explainable models.

# What is each part of an image?



# What is each part of an image?

- Pixel -> picture element

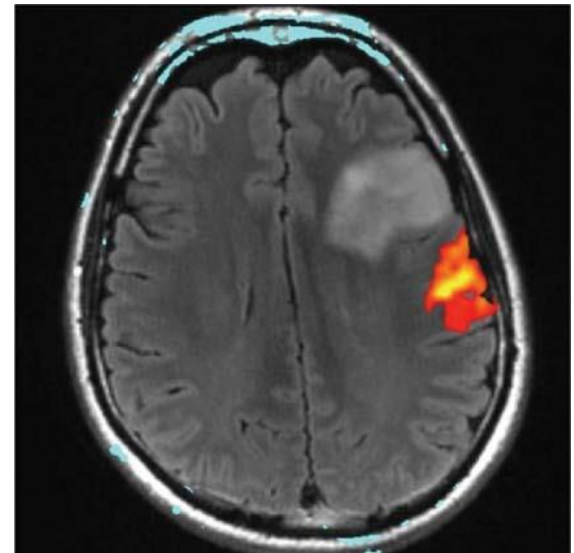
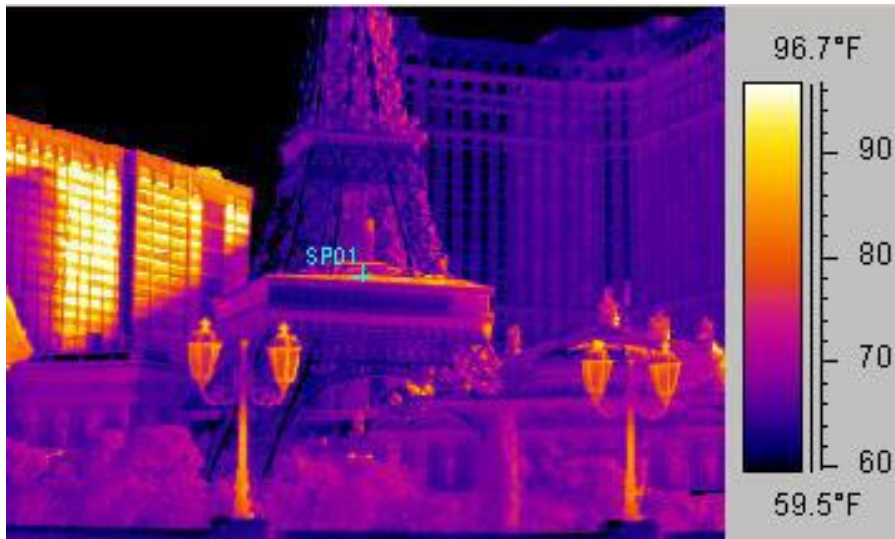


# Image as a 2D sampling of signal

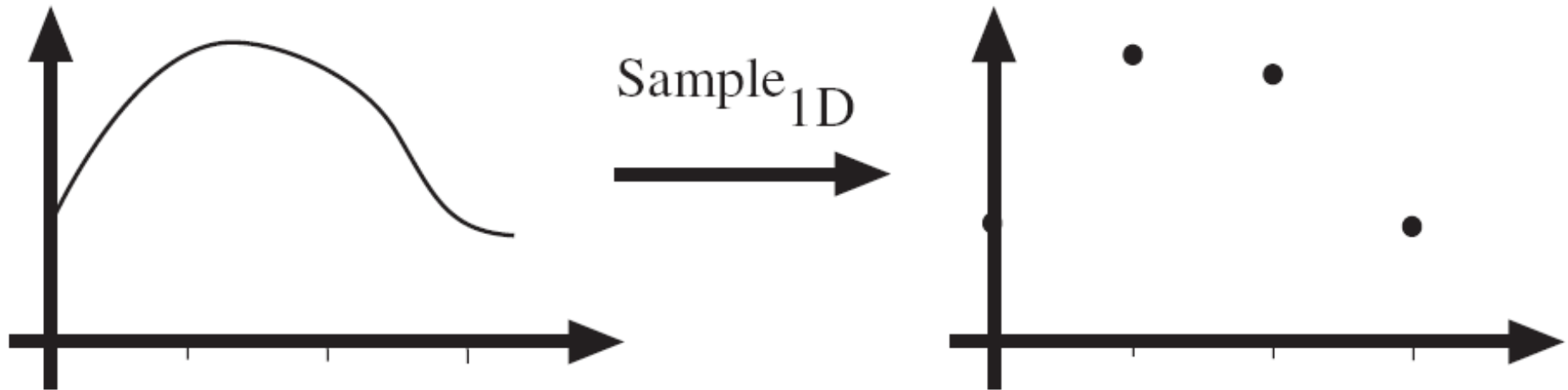
- Signal: function depending on some variable with physical meaning.
- Image: sampling of that function.
  - 2 variables: xy coordinates
  - 3 variables: xy + time (video)
  - ‘Brightness’ is the value of the function for visible light
- Can be other physical values too: temperature, pressure, depth ...



# Example 2D Images

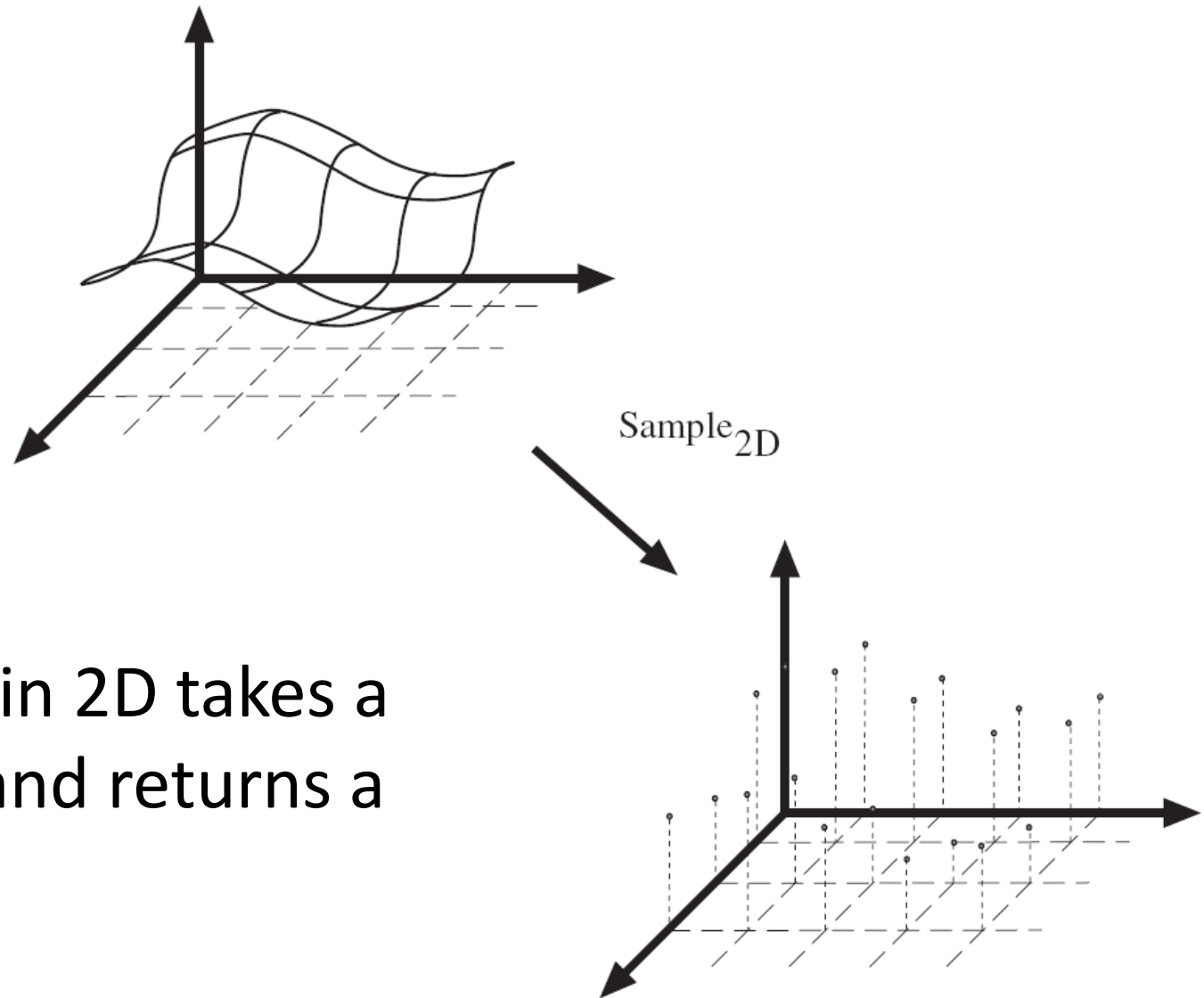


# Sampling in 1D



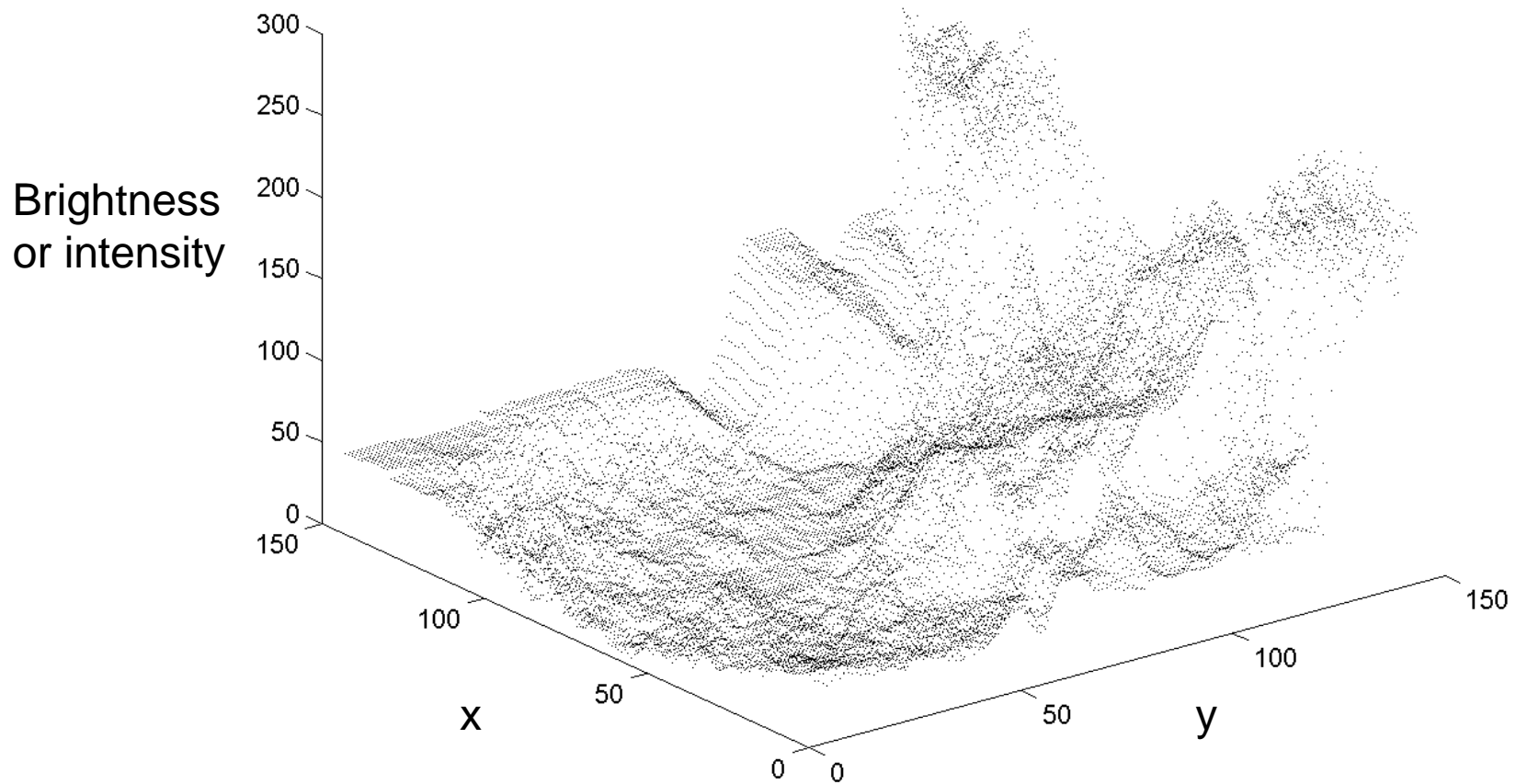
- Sampling in 1D takes a function, and returns a vector whose elements are values of that function at the sample points.

# Sampling in 2D



- Sampling in 2D takes a function and returns a matrix.

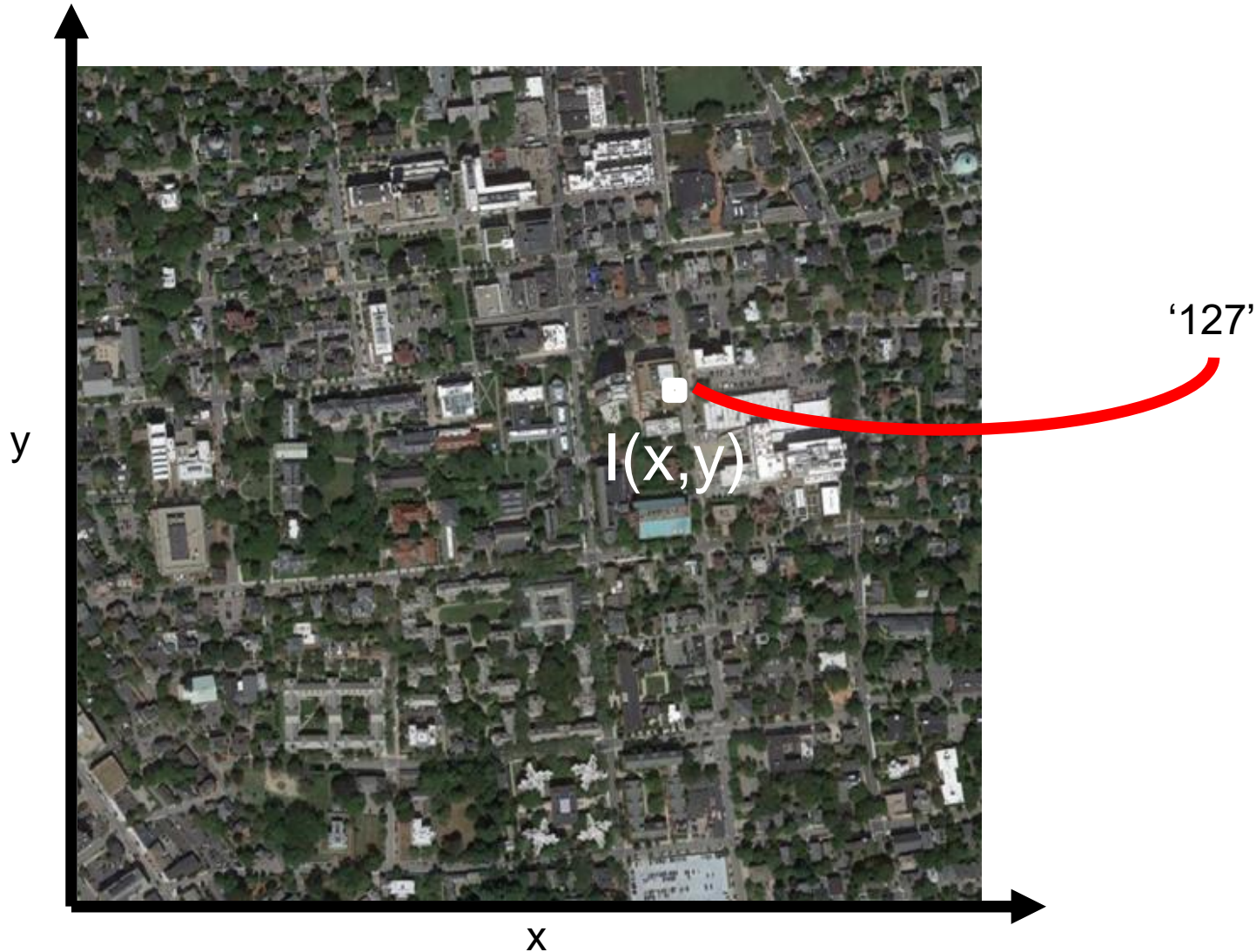
# Grayscale Digital Image



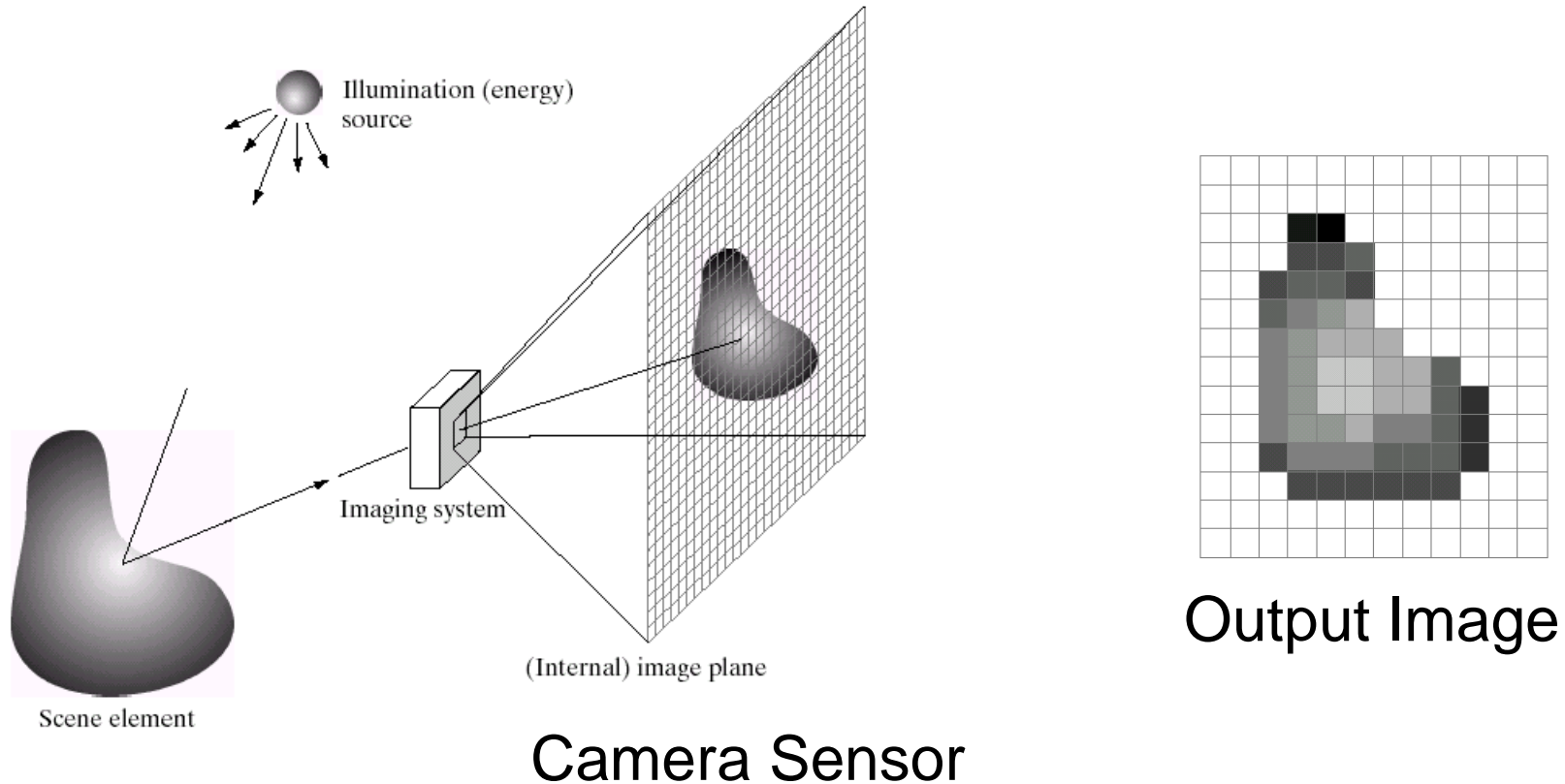


# What is each part of a photograph?

- Pixel -> picture element

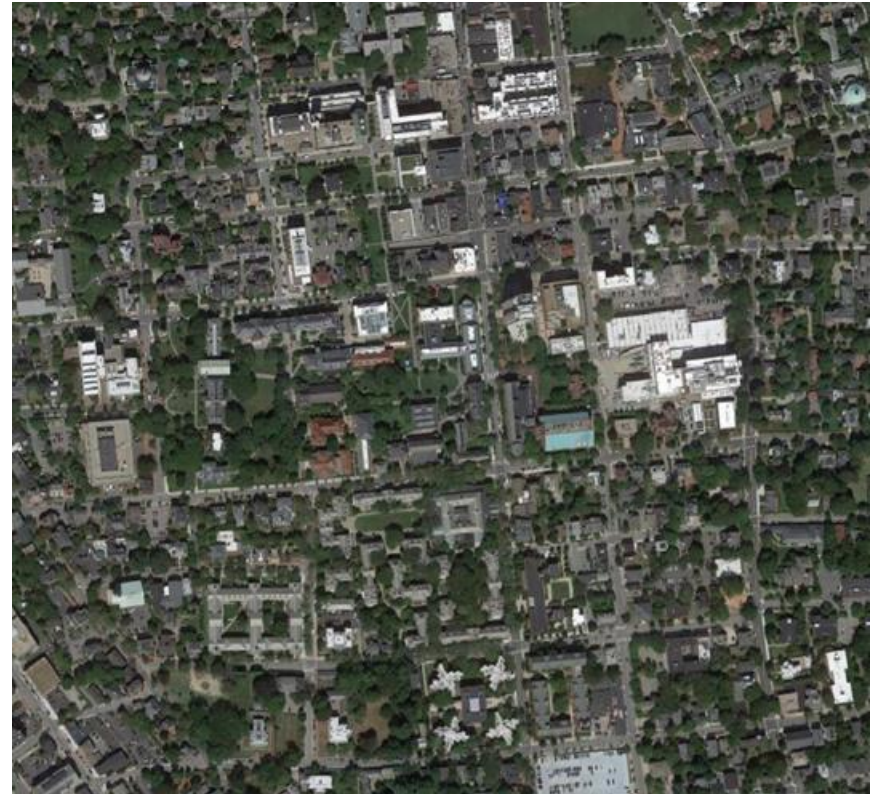


# Integrating light over a range of angles.

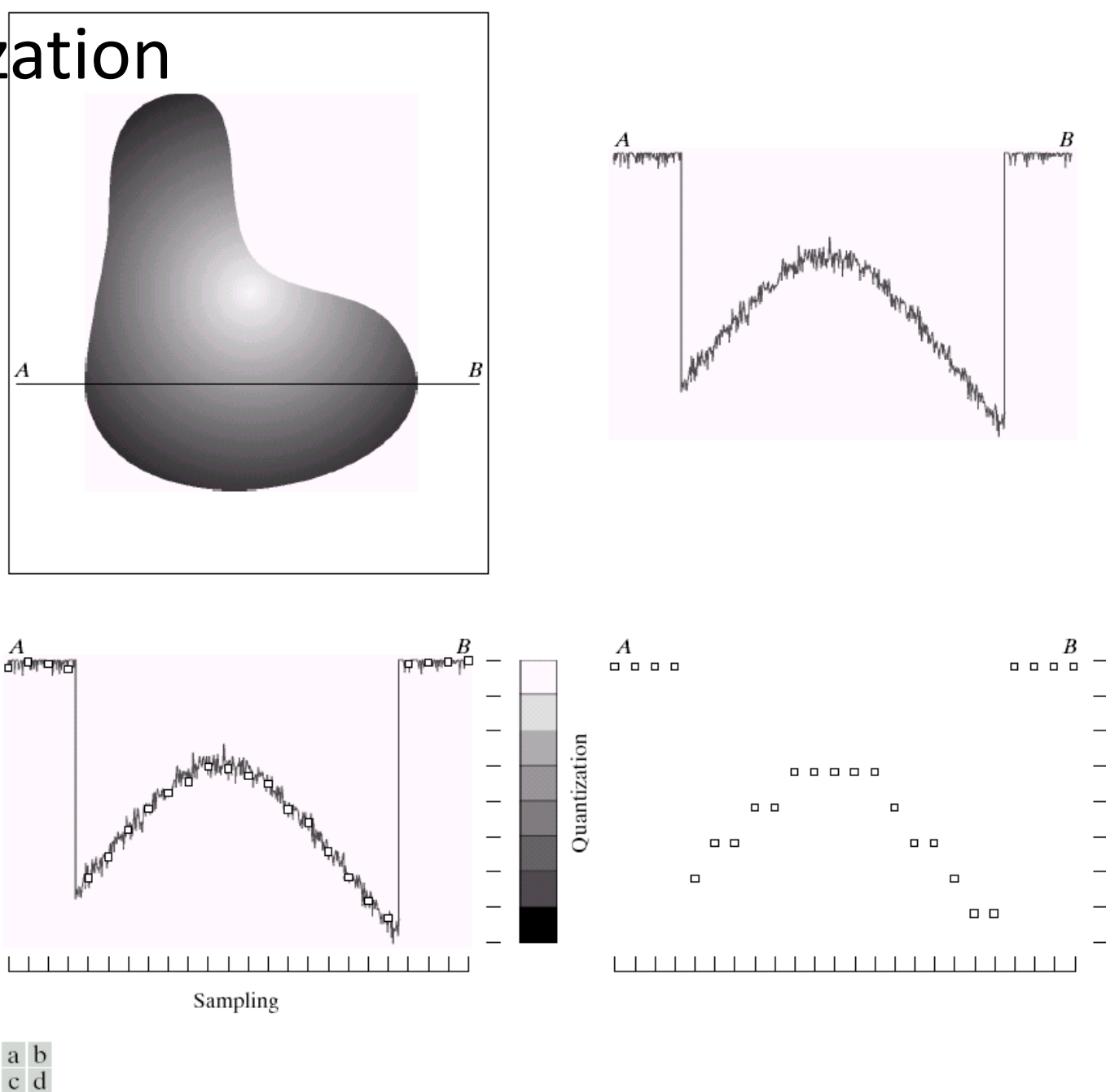


# Resolution – geometric vs. spatial resolution

Both images are  $\sim 500 \times 500$  pixels

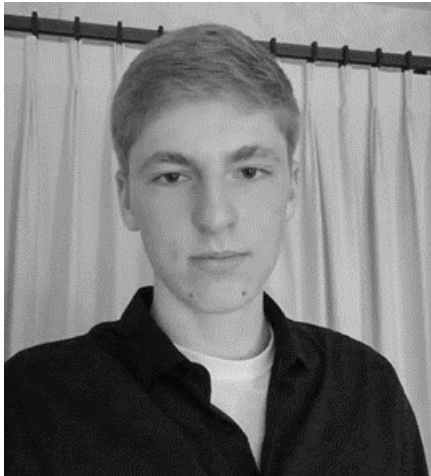


# Quantization



**FIGURE 2.16** Generating a digital image. (a) Continuous image. (b) A scan line from *A* to *B* in the continuous image, used to illustrate the concepts of sampling and quantization. (c) Sampling and quantization. (d) Digital scan line.

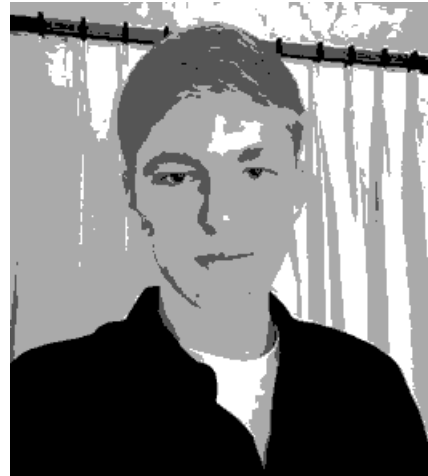
# Quantization Effects – Radiometric Resolution



8 bit – 256 levels



4 bit – 16 levels



2 bit – 4 levels



1 bit – 2 levels



# Color

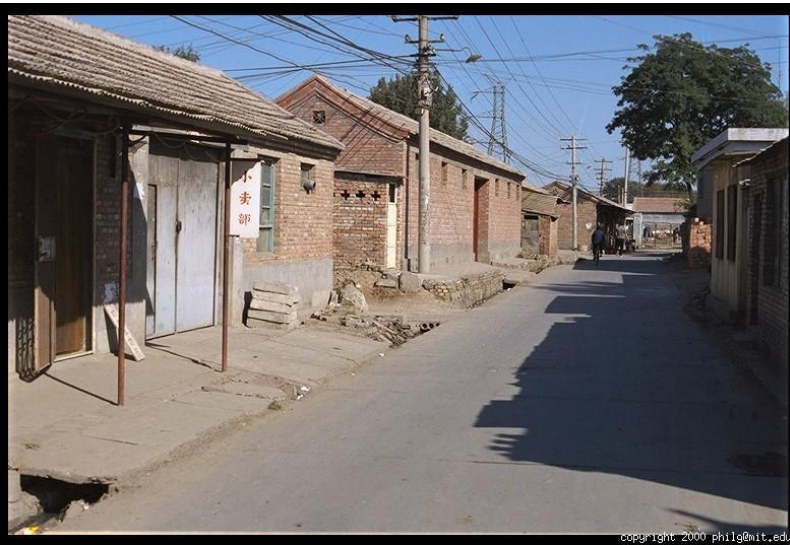
R



G



B



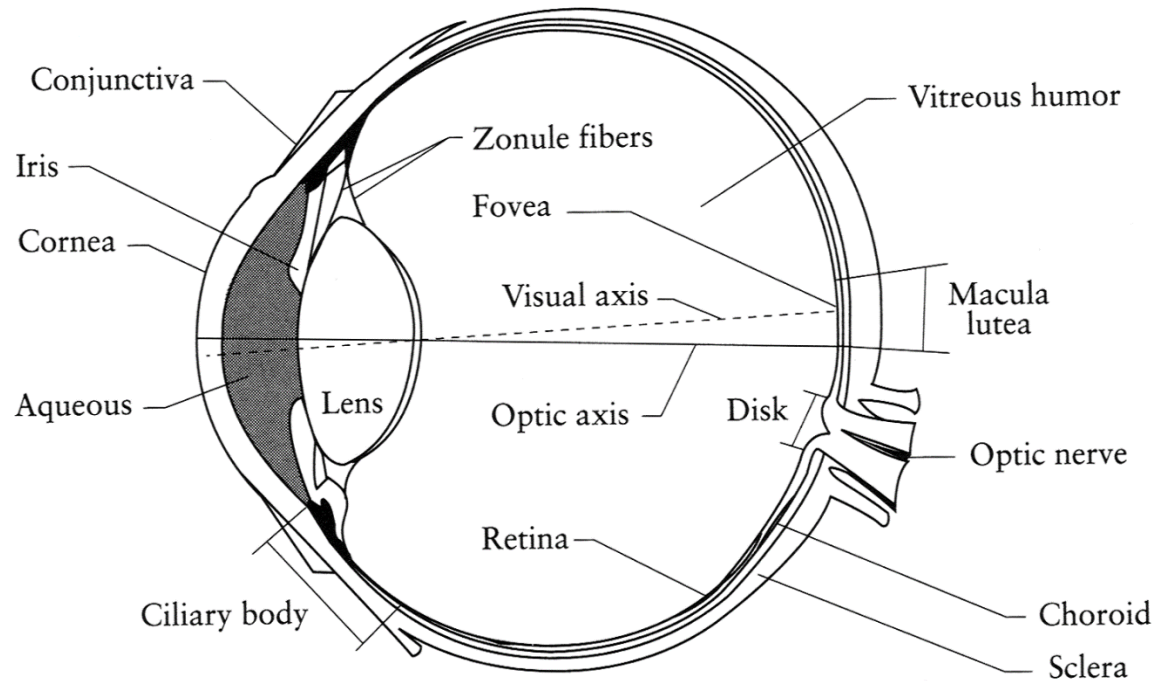




But what is color?

**ANATOMY**

# The Eye



- The human eye is a camera
  - **Iris** - colored annulus with radial muscles
  - **Pupil** - the hole (aperture) whose size is controlled by the iris
  - What's the sensor?
    - photoreceptor cells (rods and cones) in the **retina**

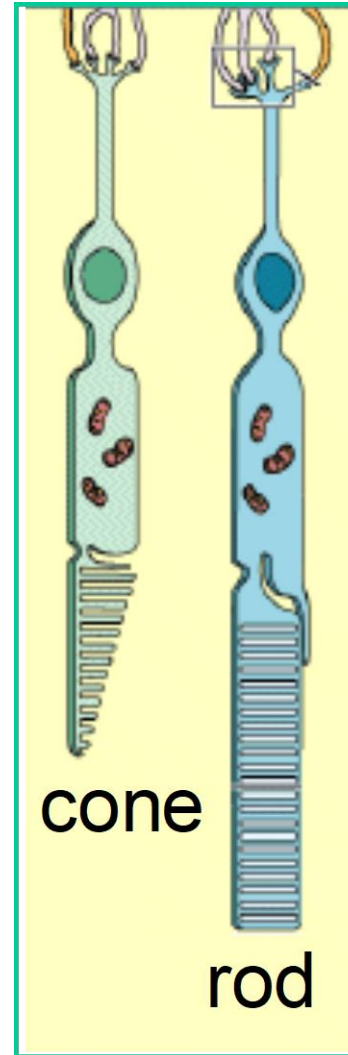
# Two types of light-sensitive receptors

## Cones

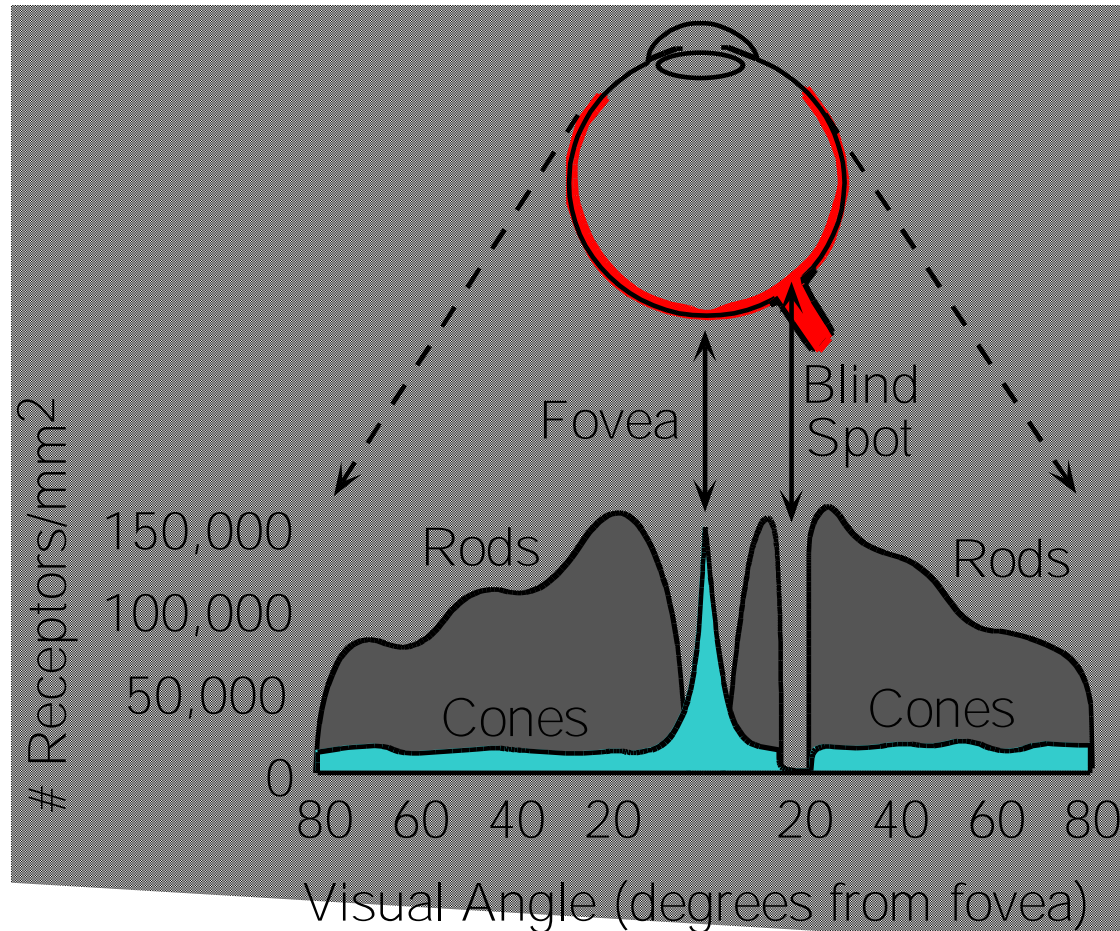
- cone-shaped
- less sensitive
- operate in high light
- color vision

## Rods

- rod-shaped
- highly sensitive
- operate at night
- gray-scale vision



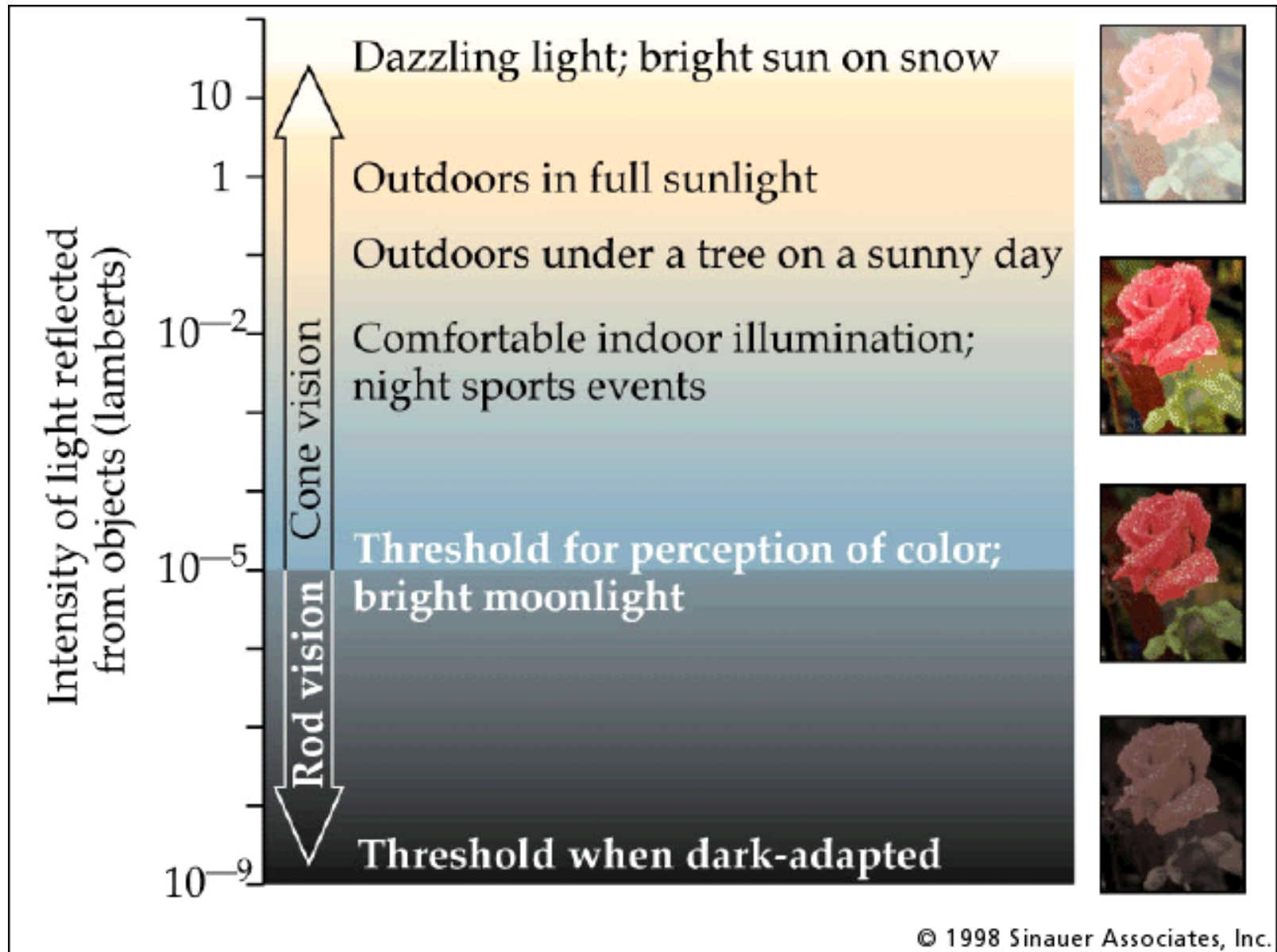
# Distribution of Rods and Cones



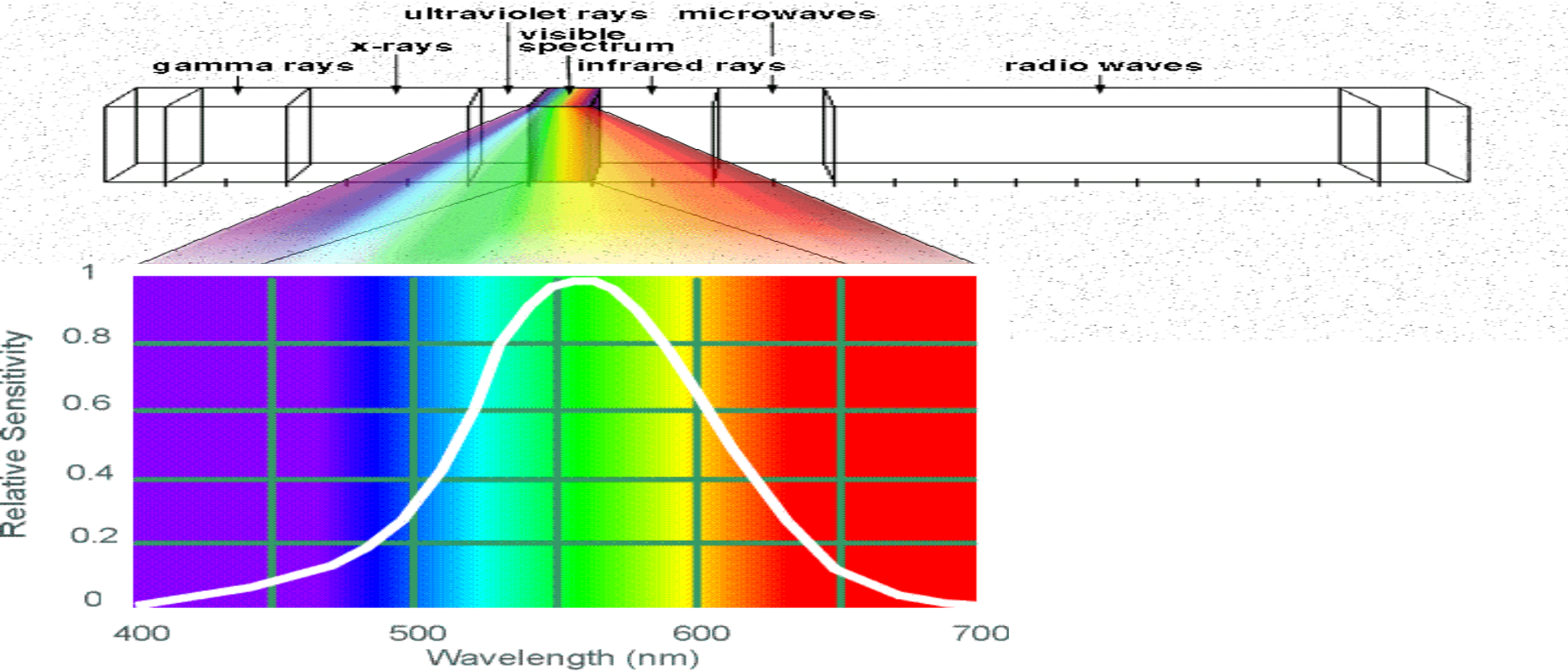
Night Sky: why are there more stars off-center?

Averted vision: [http://en.wikipedia.org/wiki/Averted\\_vision](http://en.wikipedia.org/wiki/Averted_vision)

# Rod / Cone sensitivity



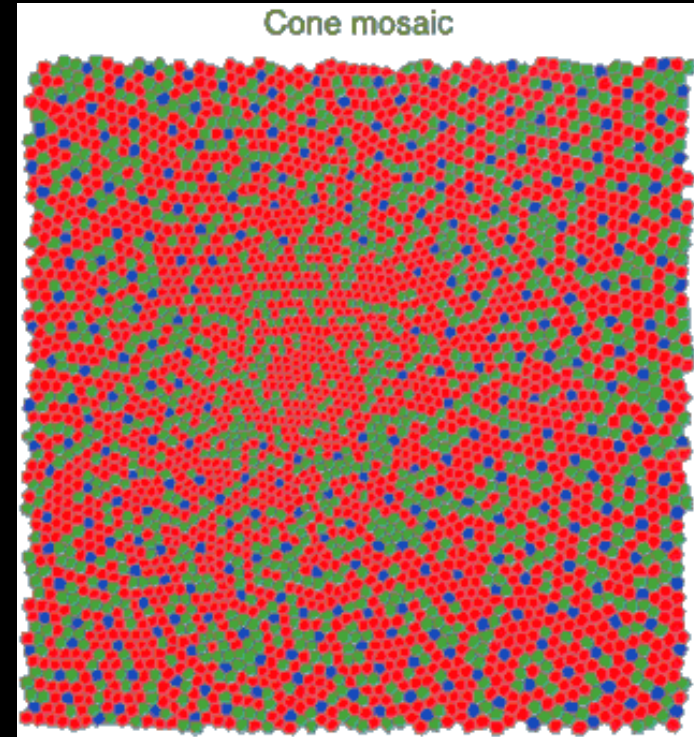
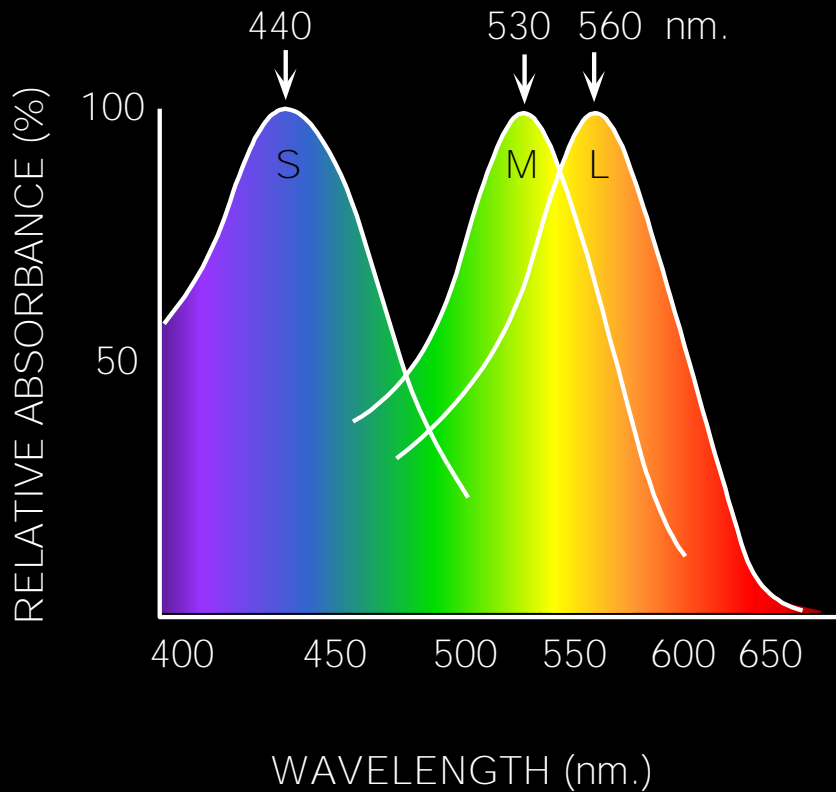
# Electromagnetic Spectrum



Human Luminance Sensitivity Function

# Physiology of Color Vision

Three kinds of cones:

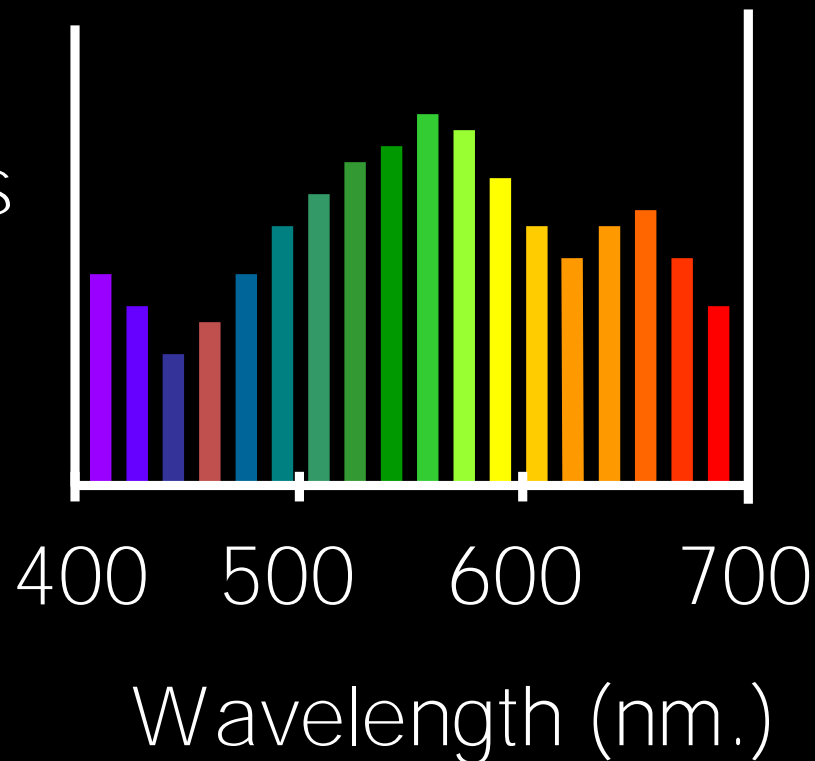




# The Physics of Light

Any patch of light can be completely described physically by its spectrum: the number of photons (per time unit) at each wavelength 400 - 700 nm.

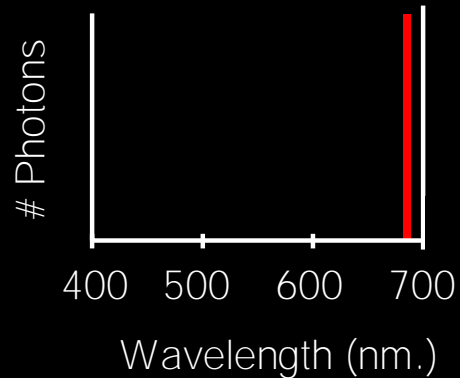
# Photons  
(per ms.)



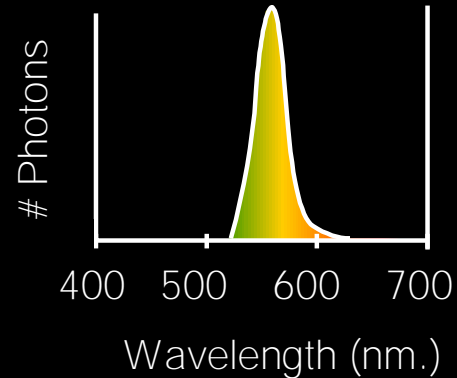
# The Physics of Light

## Some examples of the spectra of light sources

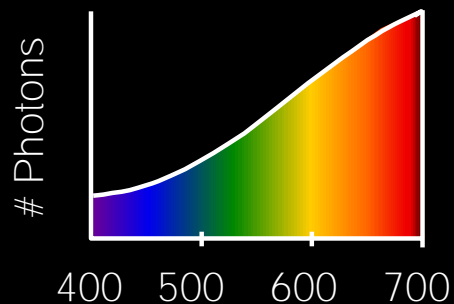
A. Ruby Laser



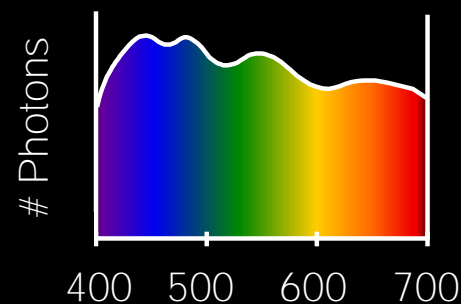
B. Gallium Phosphide Crystal



C. Tungsten Lightbulb

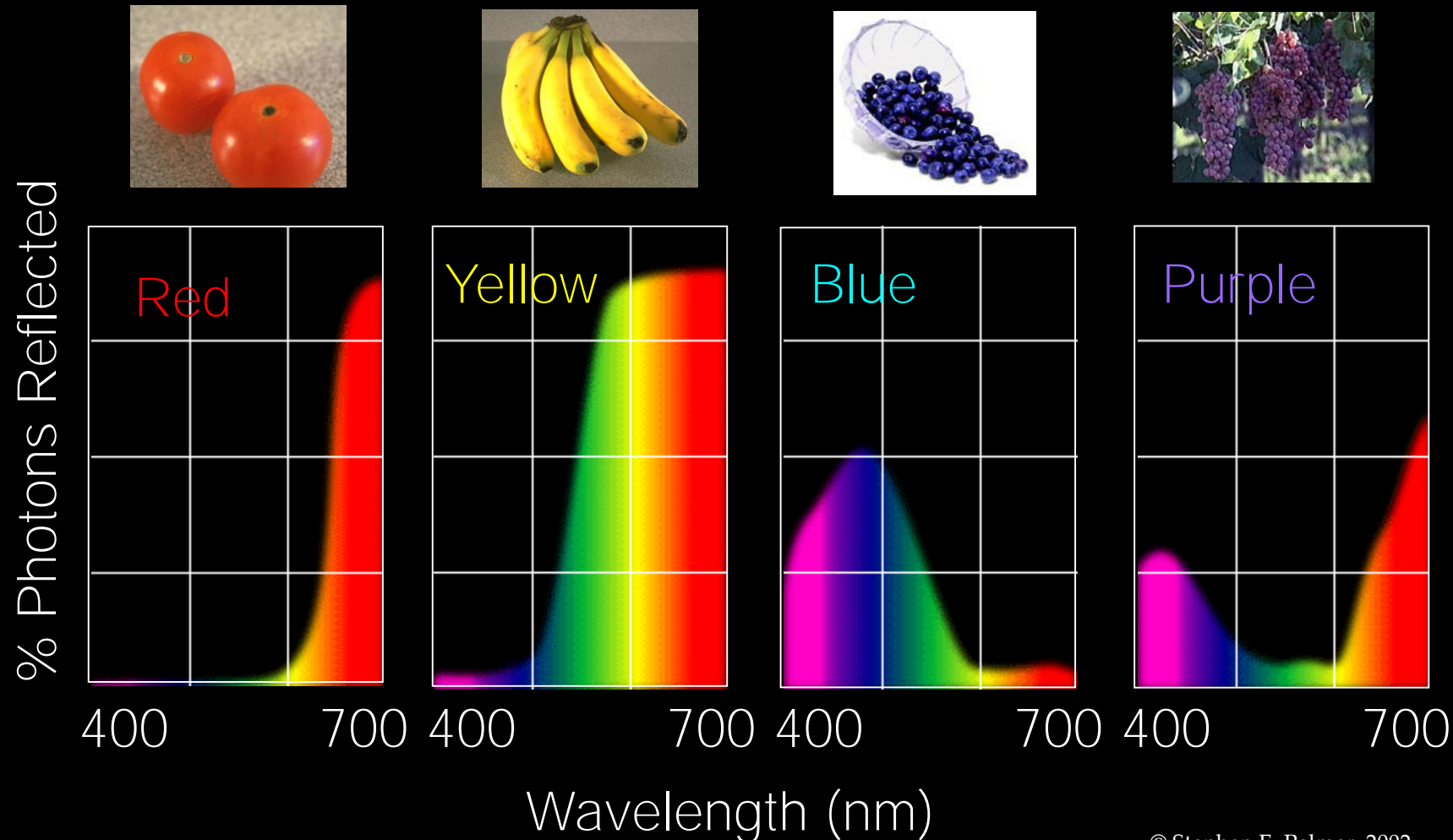


D. Normal Daylight



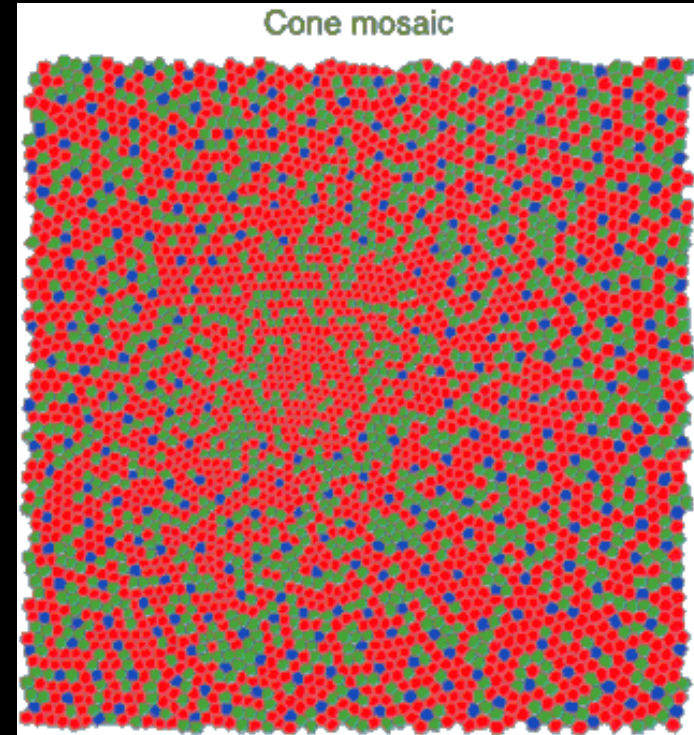
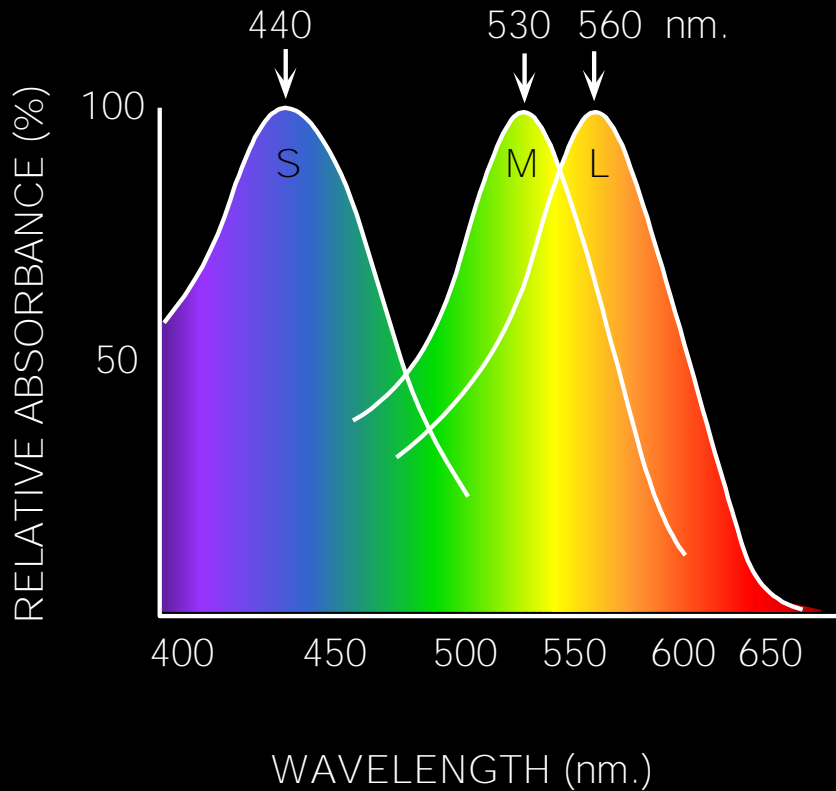
# The Physics of Light

Some examples of the reflectance spectra of surfaces



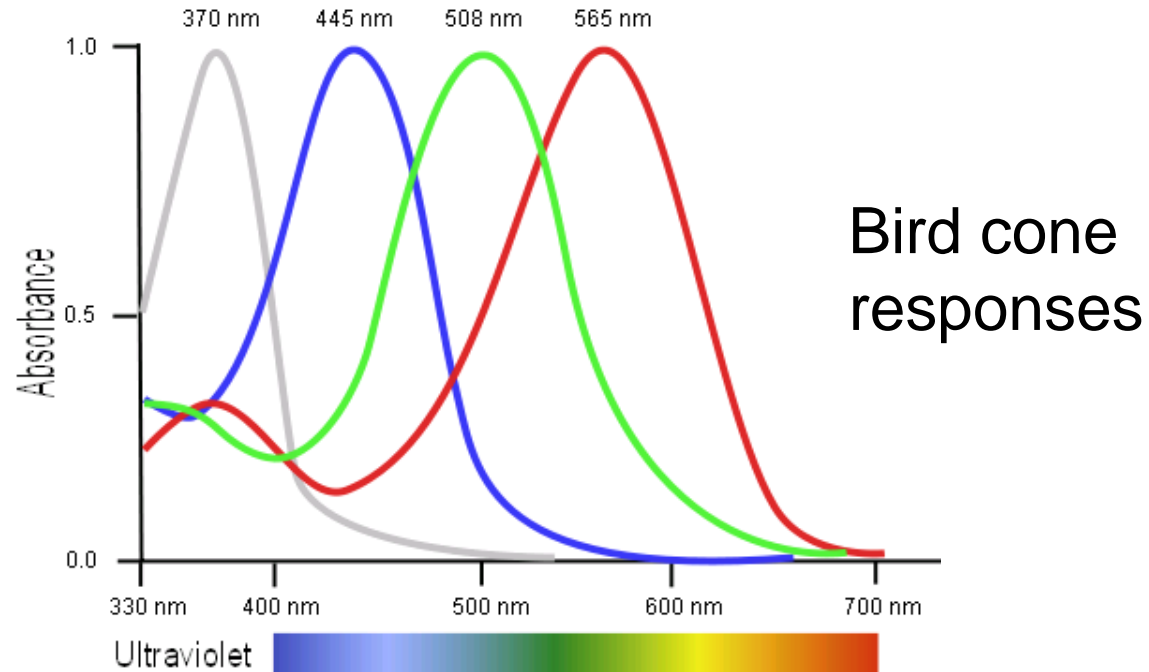
# Physiology of Color Vision

Three kinds of cones:



- Why are M and L cones so close?
- Why are there 3?

# Tetrachromatism



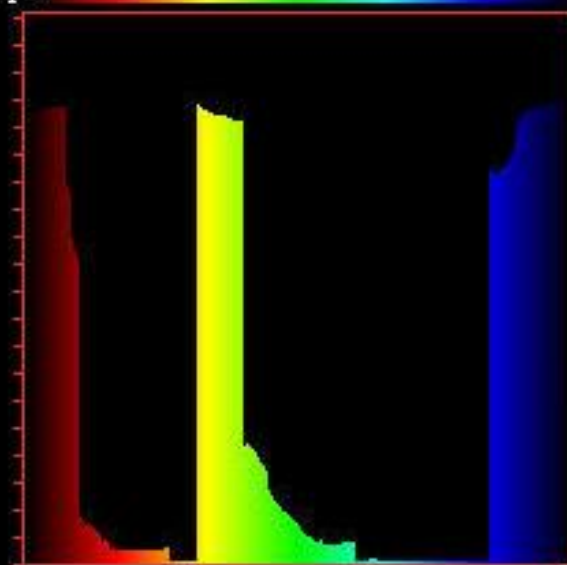
- Most birds, and many other animals, have cones for ultraviolet light.
- Some humans seem to have four cones (12% of females).
- True tetrachromatism is rare; requires learning.

# Bee vision



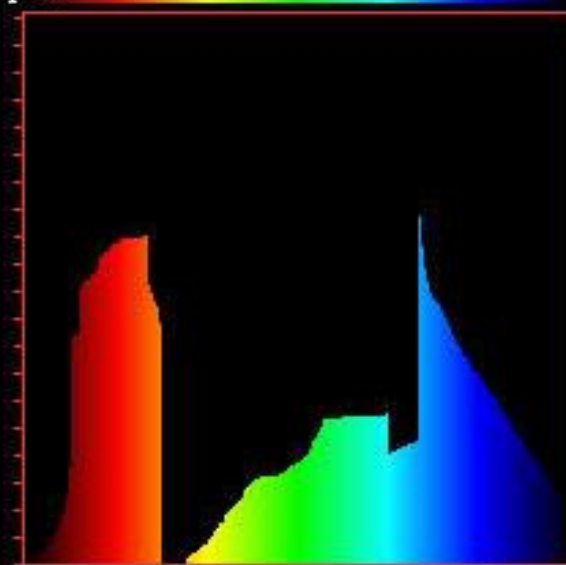
# Metamers

Input



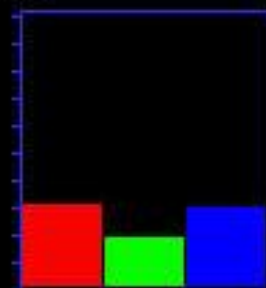
Frequency

Input



Frequency

Result



Result



by Jeff Beall, Adam Doppelt and John F. Hughes

(c) 1995 Brown University and the NSF Graphics and Visualization Center



What is color?

Why do we even care about  
human vision in this class?

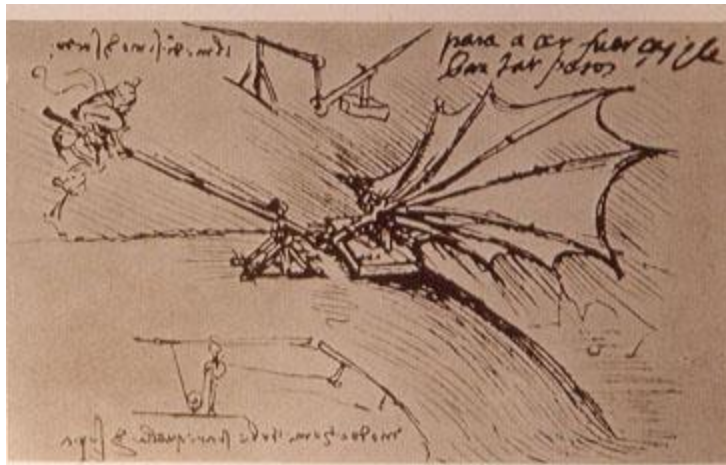
# Why do we care about human vision?

- We don't, necessarily.
- But biological vision shows that it is possible to make important judgements from images.

# Why do we care about human vision?

- We don't, necessarily.
- But biological vision shows that it is possible to make important judgements from images.
- It's a human world -> cameras imitate the frequency response of the human eye to try to see as we see.

# Ornithopters



"Can machines fly like a bird?"

No, because airplanes don't flap.

"Can machines fly?"

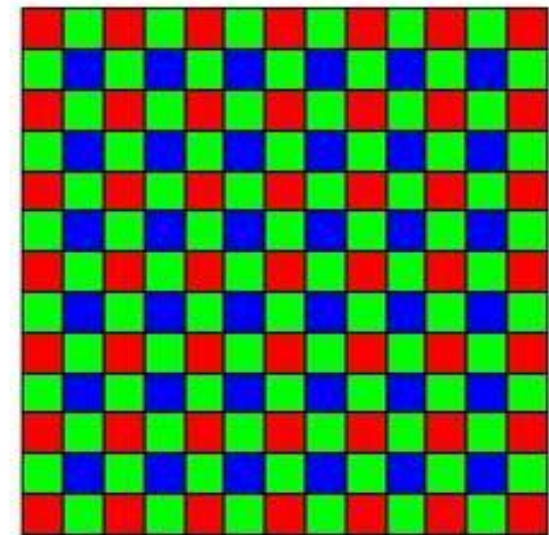
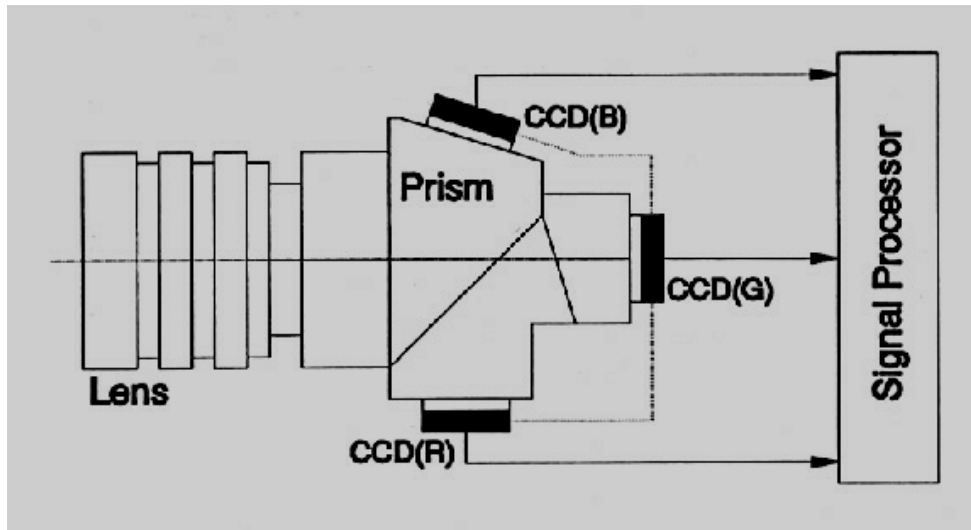
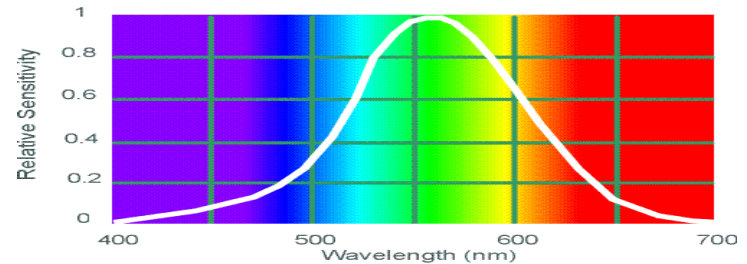
Yes, but airplanes use a different mechanism.

"Can machines perceive?"

Is this question like the first, or like the second?

# Color Sensing in Camera (RGB)

- 3-chip vs. 1-chip: quality vs. cost
- Why more green?



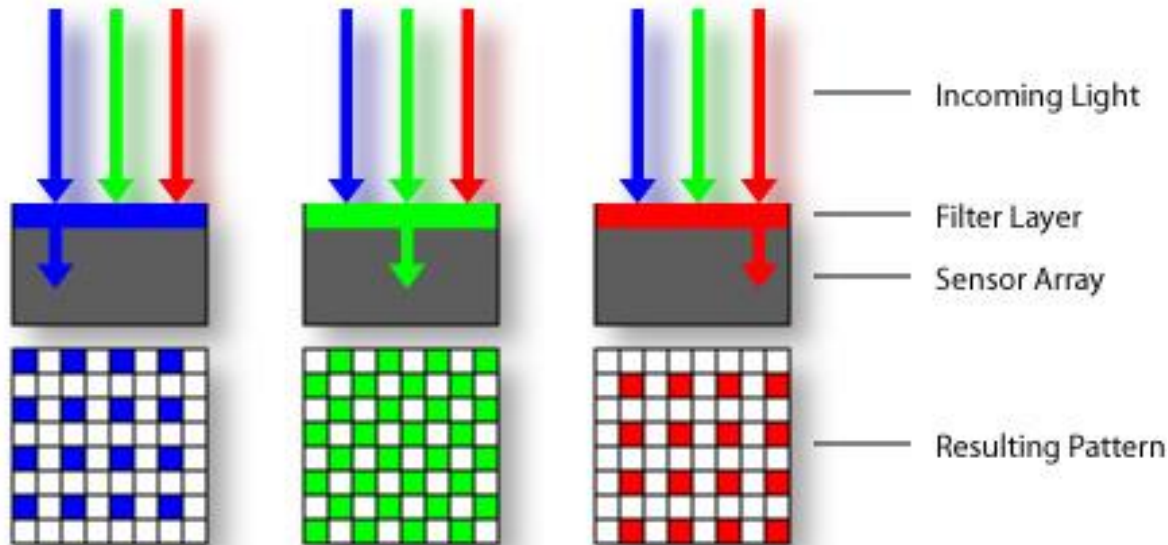
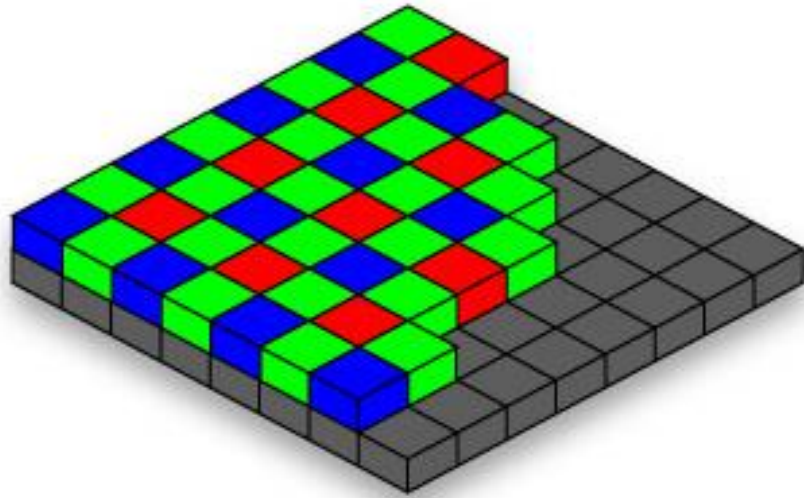
**Bayer filter**

Ruff Works

Why 3 colors?

<http://www.cooldictionary.com/words/Bayer-filter.wikipedia>

# Practical Color Sensing: Bayer Grid

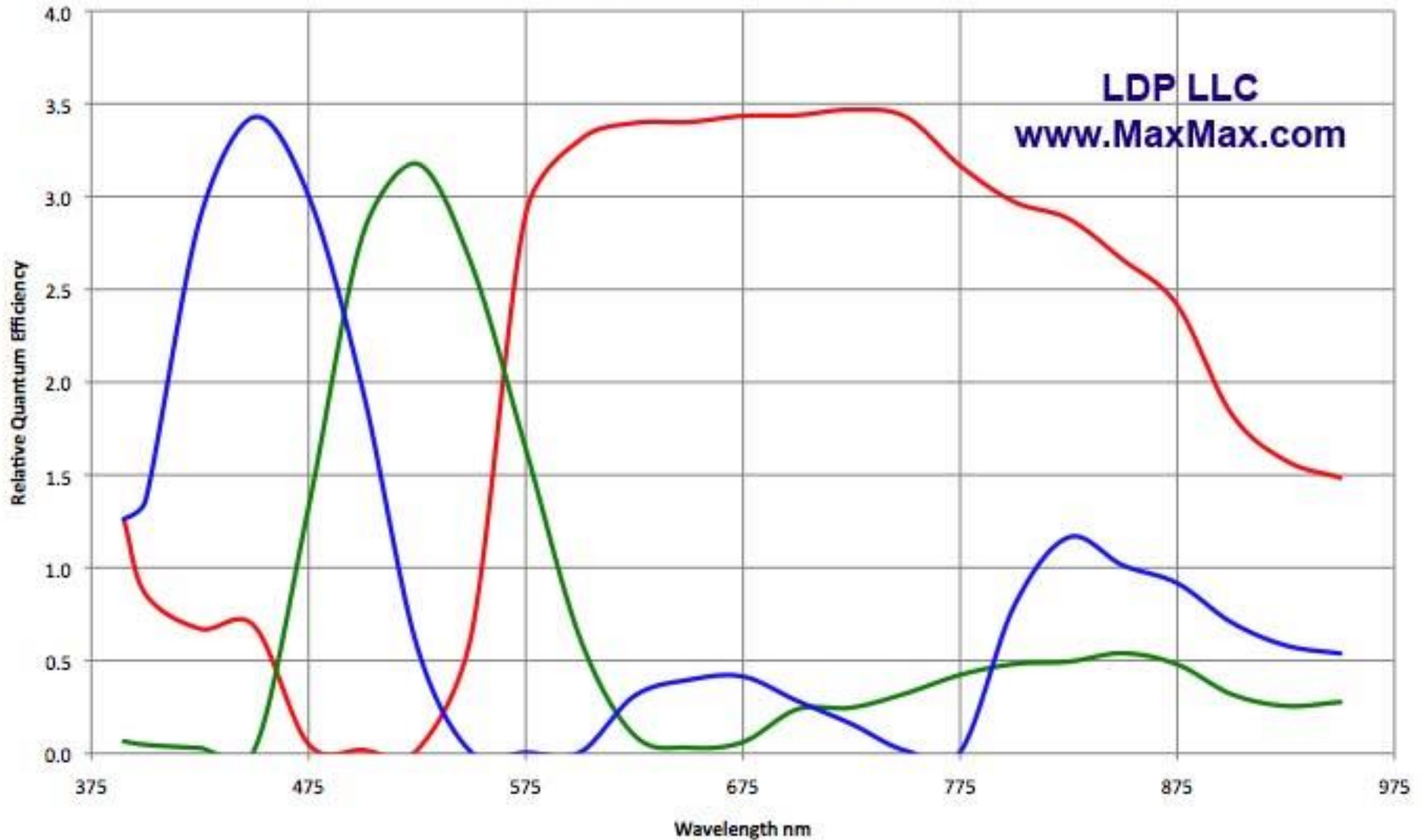


- Estimate RGB at 'G' cells from neighboring values



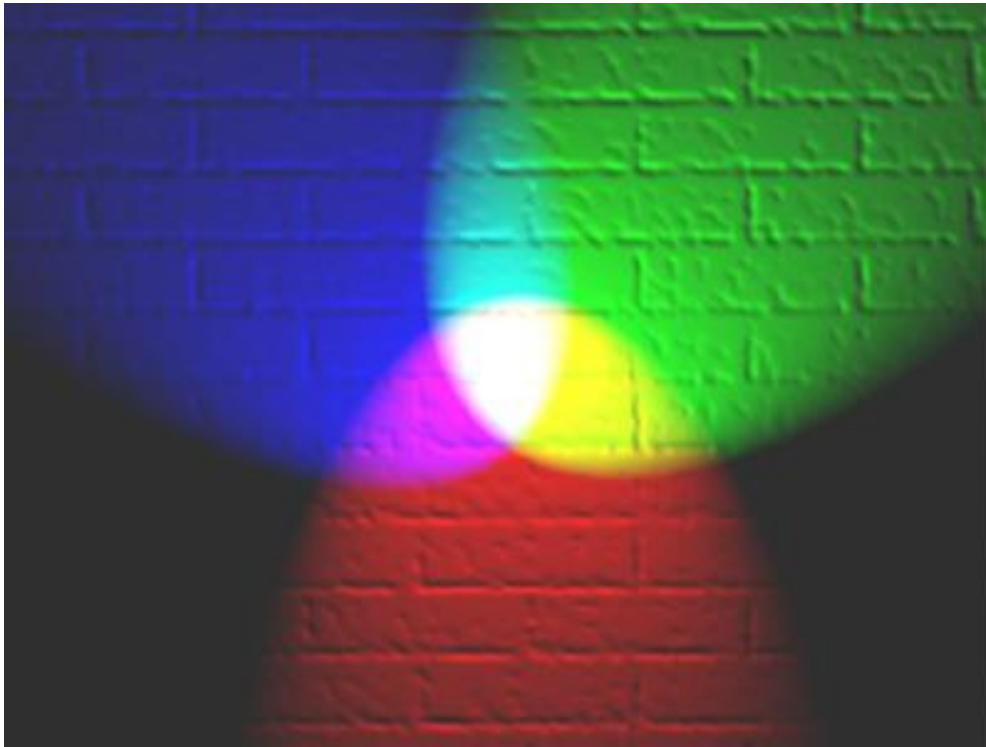
# Camera Color Response

Canon 450D Quantum Efficiency



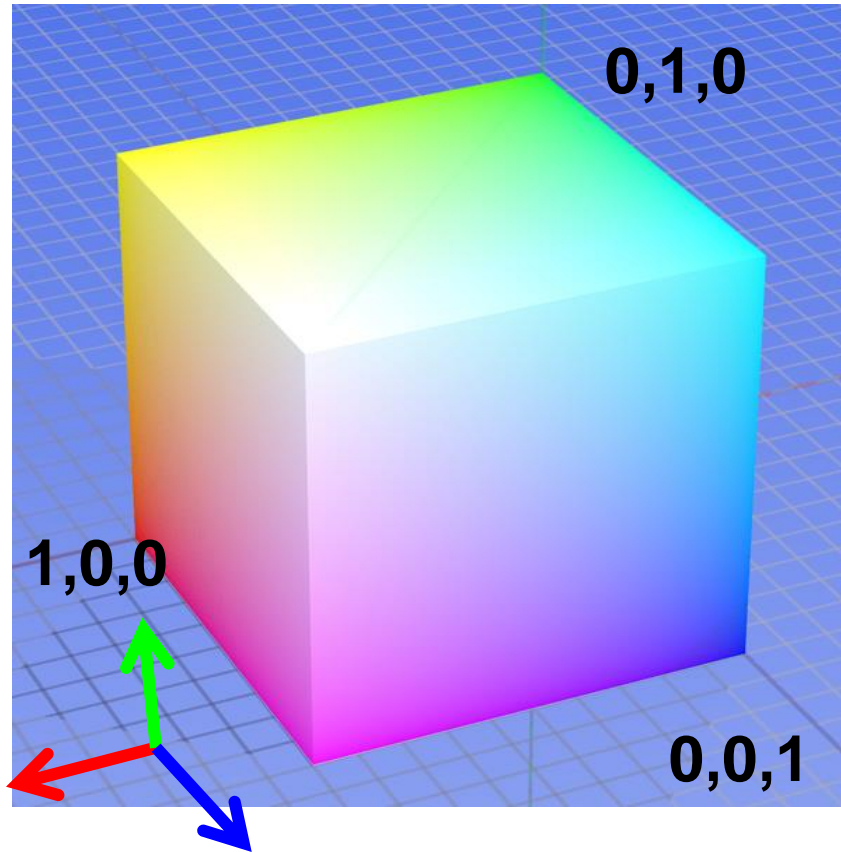
# Color spaces

- How can we represent color?



# Color spaces: RGB

Default color space



Any color =  $r \cdot R + g \cdot G + b \cdot B$

- Strongly correlated channels
- Non-perceptual



**R = 1**  
(G=0,B=0)



**G = 1**  
(R=0,B=0)



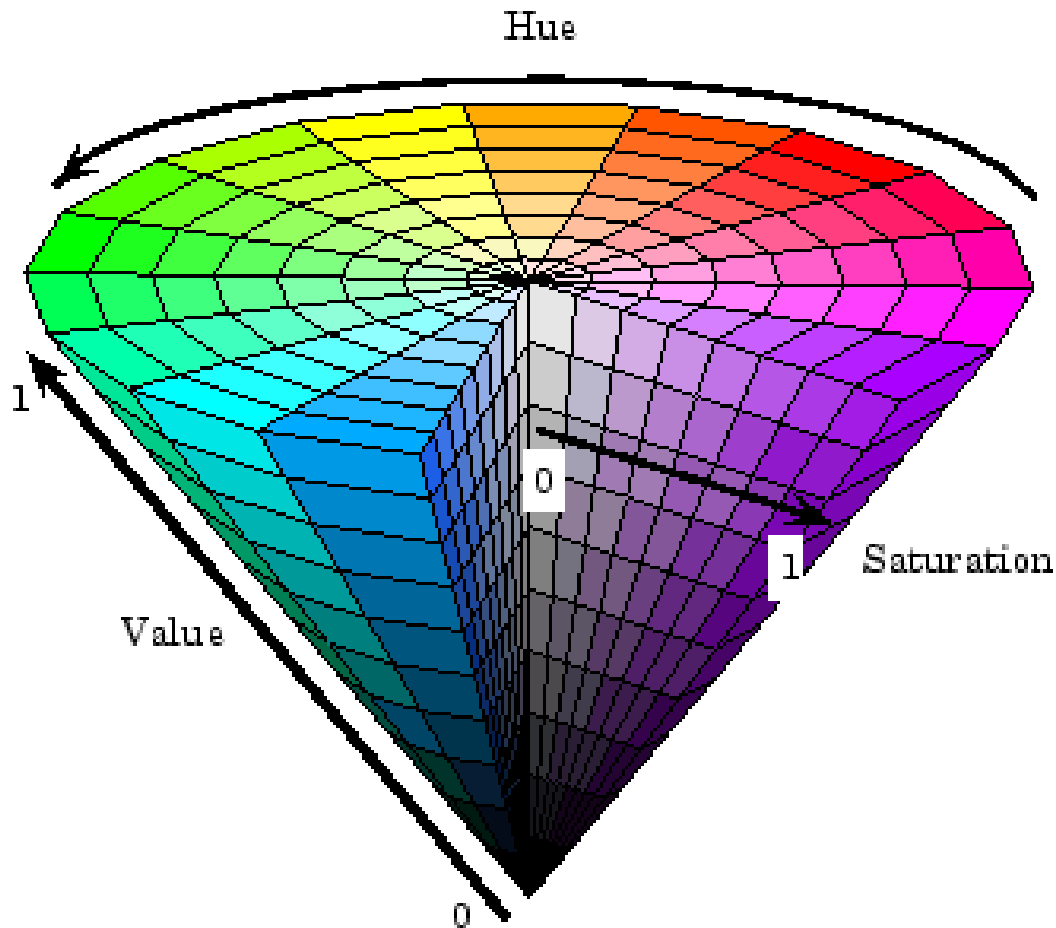
**B = 1**  
(R=0,G=0)

Got it.  $C = r*R + g*G + b*B$

**IS COLOR A VECTOR SPACE?**  
**THINK-PAIR-SHARE**

# Color spaces: HSV

Intuitive color space



If you had to choose, would you rather go without:

- intensity ('value'), or
- hue + saturation ('chroma')?

Think-Pair-Share



# Most information in intensity



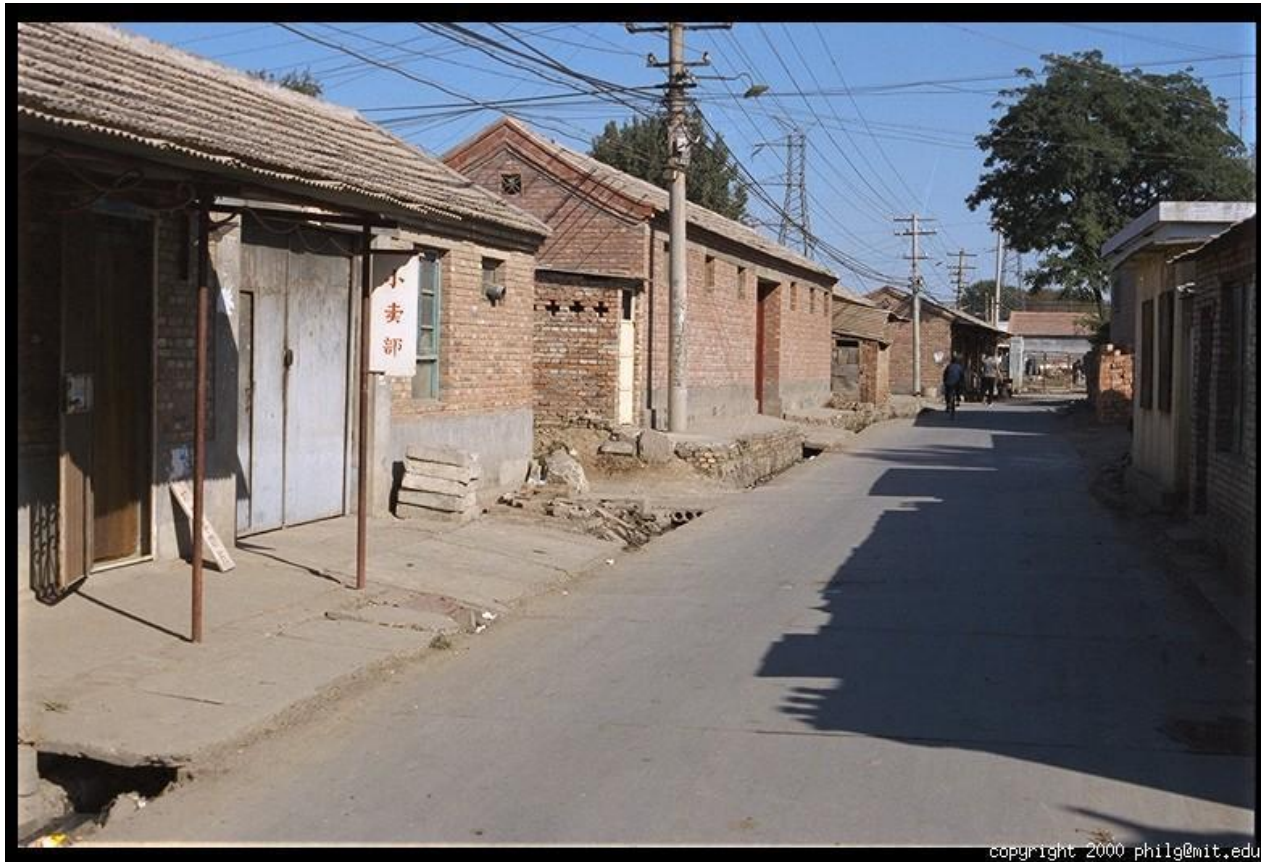
Only color shown – constant intensity

# Most information in intensity



Only intensity shown – constant color

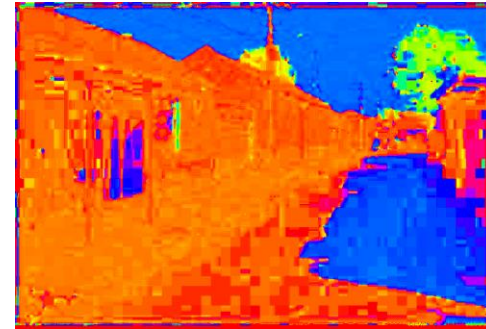
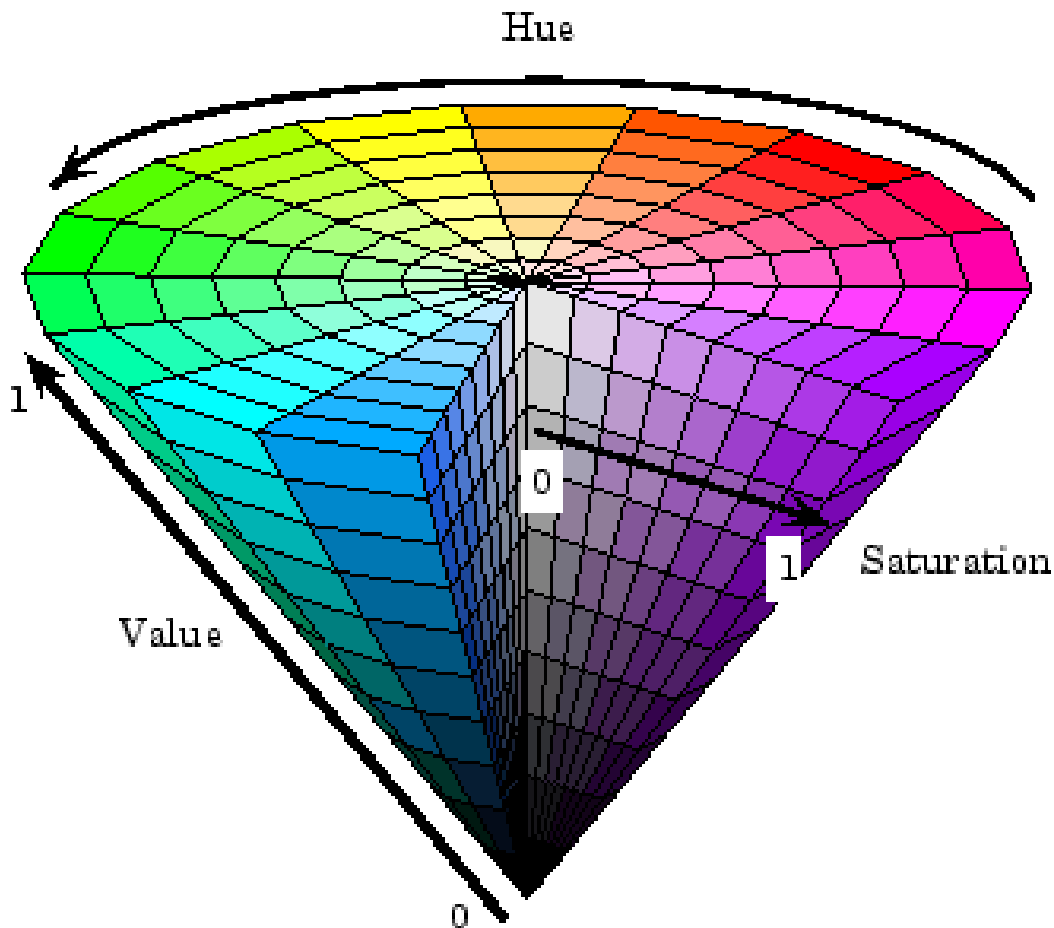
# Most information in intensity



Original image

# Color spaces: HSV

## Intuitive color space



**H**  
(S=1,V=1)



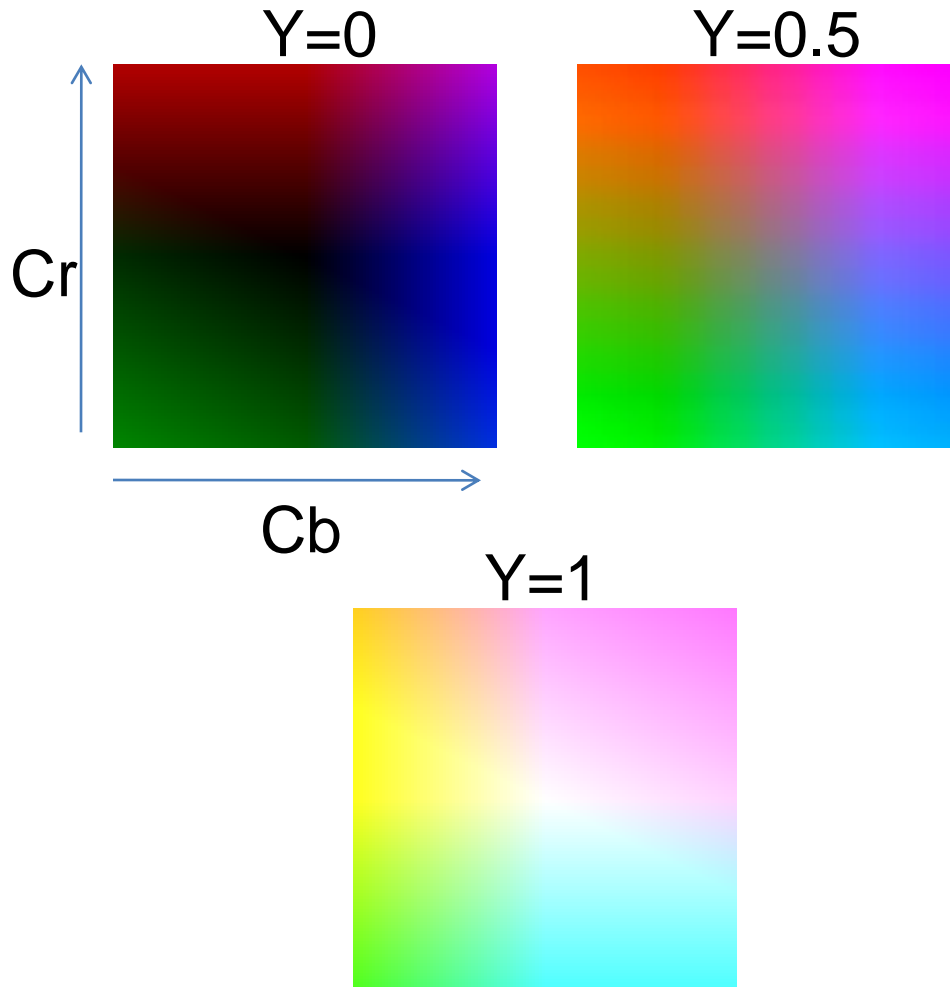
**S**  
(H=1,V=1)



**V**  
(H=1,S=0)

# Color spaces: YCbCr

Fast to compute, good for compression, used by TV



**Y**  
(Cb=0.5,Cr=0.5)



**Cb**  
(Y=0.5,Cr=0.5)



**Cr**  
(Y=0.5,Cb=0.5)

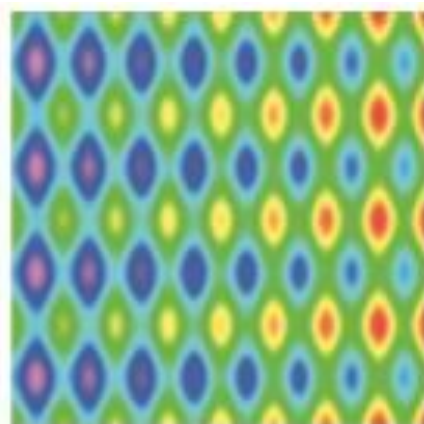
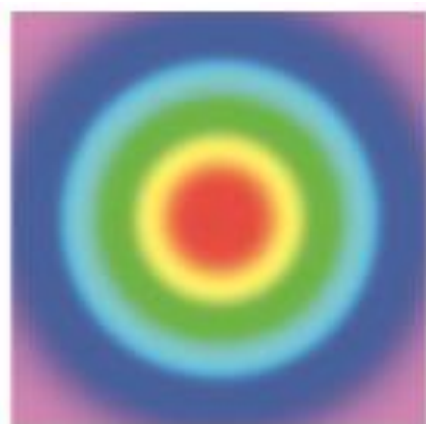


# Most JPEG images & videos subsample chroma



PSP Comp 3  
2x2 Chroma subsampling  
285K

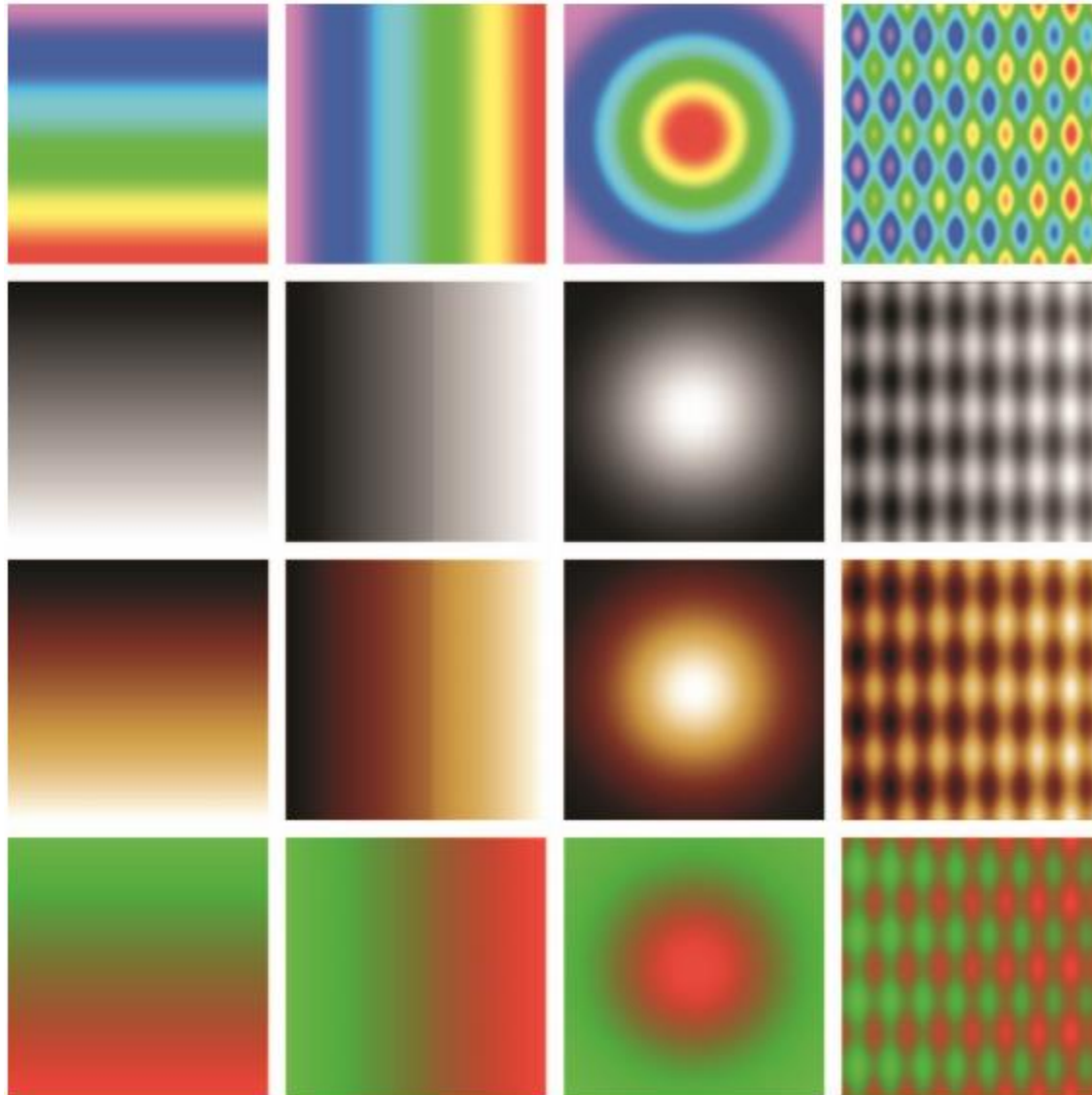
Original  
1,261K lossless  
968K PNG





# Rainbow color map considered harmful

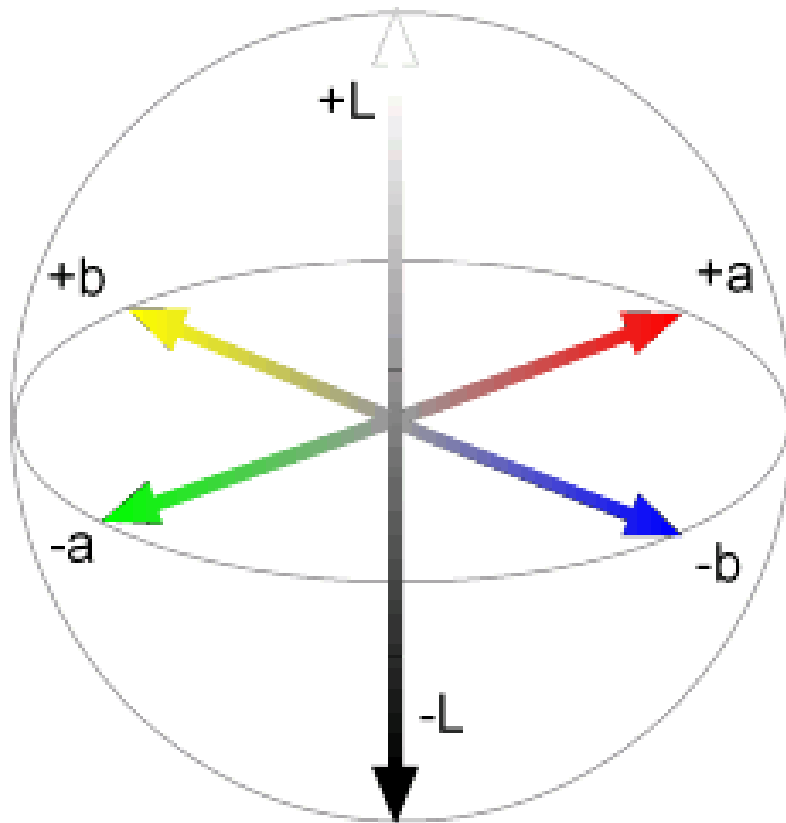
Borland and Taylor



**IS COLOR PERCEPTION  
A VECTOR SPACE?**

# Color spaces: $L^*a^*b^*$

“Perceptually uniform”\* color space



**L**  
( $a=0, b=0$ )

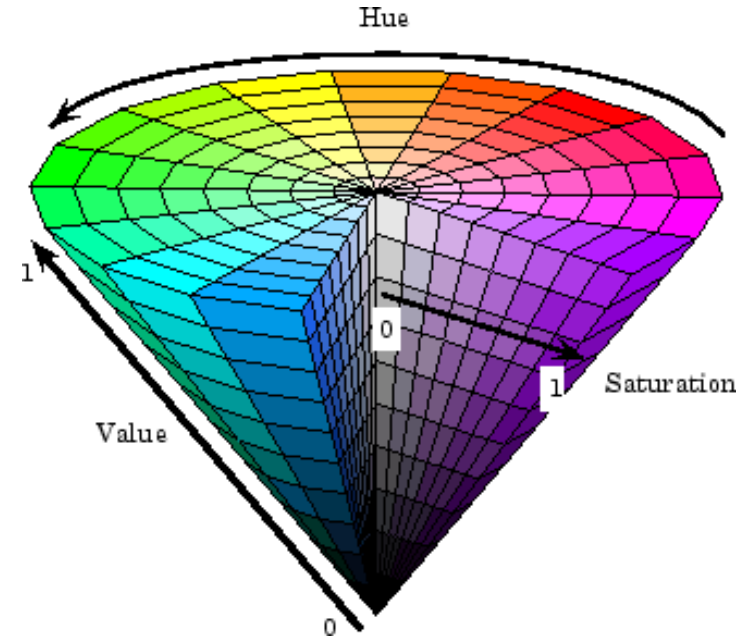
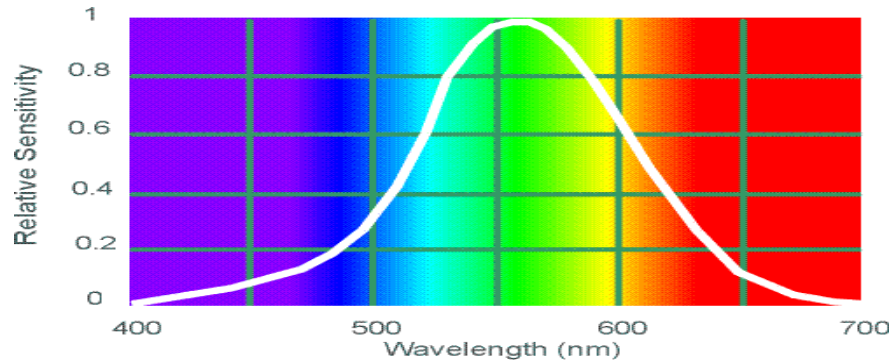


**a**  
( $L=65, b=0$ )



**b**  
( $L=65, a=0$ )

# “Intuitive” color space?



Wait a minute...

**WHY DOES COLOR LOOK LIKE IT  
MAPS SMOOTHLY TO A CIRCLE?**

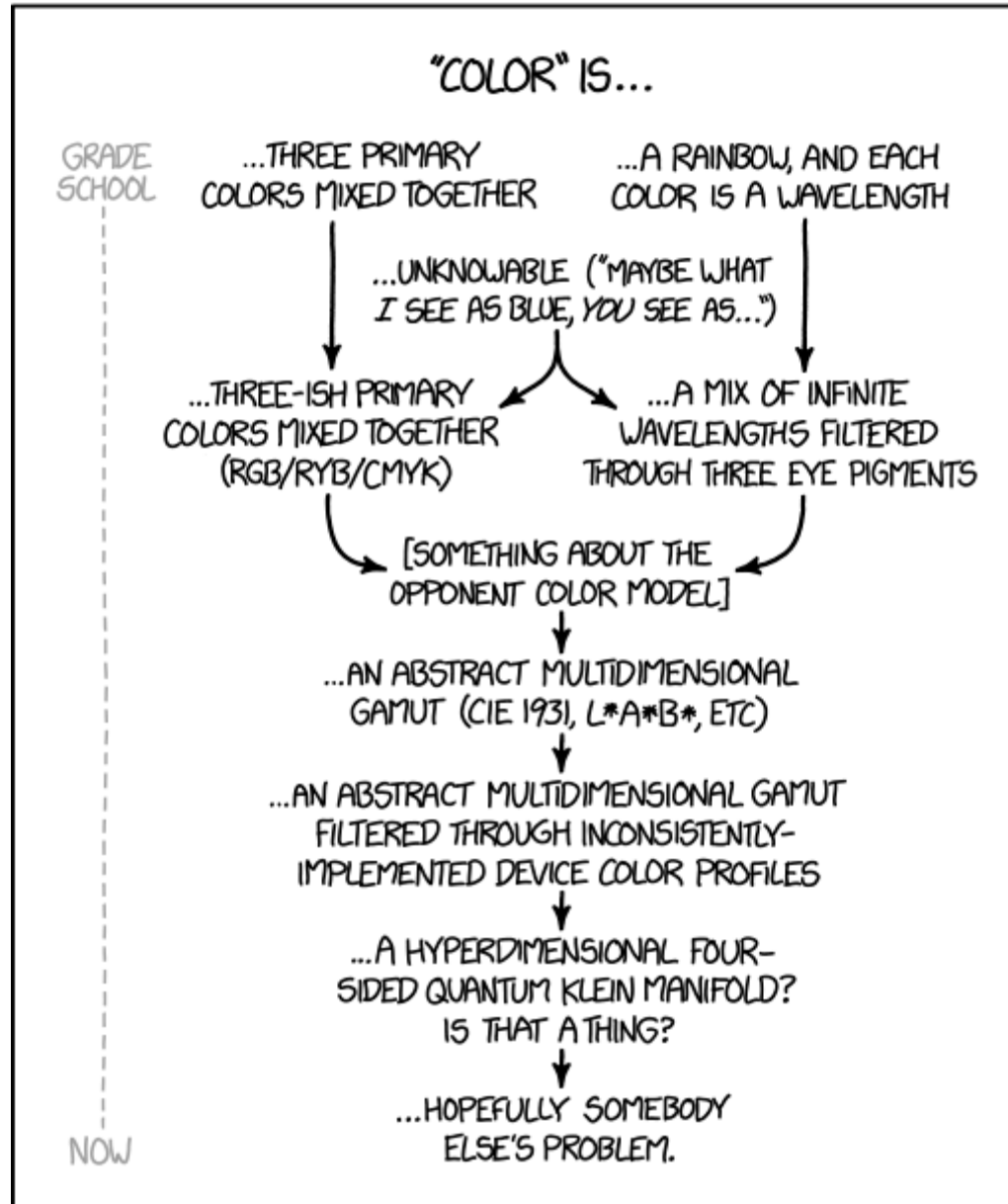
Project 0:

Tonight Sunlab 6pm-9pm

Next week: Project 1

- Convolution
- Filtering
- Image Pyramids
- Frequencies

# EVOLUTION OF MY UNDERSTANDING OF COLOR OVER TIME:



# More references

- <https://www.colorsystem.com/>
- A description of many different color systems developed through history.
- Navigate from the right-hand links.
- Thanks to Alex Nibley!



# Proj 1: Image Filtering and Hybrid Images

- Implement image filtering to separate high and low frequencies.
- Combine high frequencies and low frequencies from different images to create a scale-dependent image.

