



THE UNIVERSITY *of* TEXAS

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HEALTH SCIENCE CENTER AT HOUSTON  
SCHOOL *of* HEALTH INFORMATION SCIENCES

# Human Vision and Color

For students of HI 5323

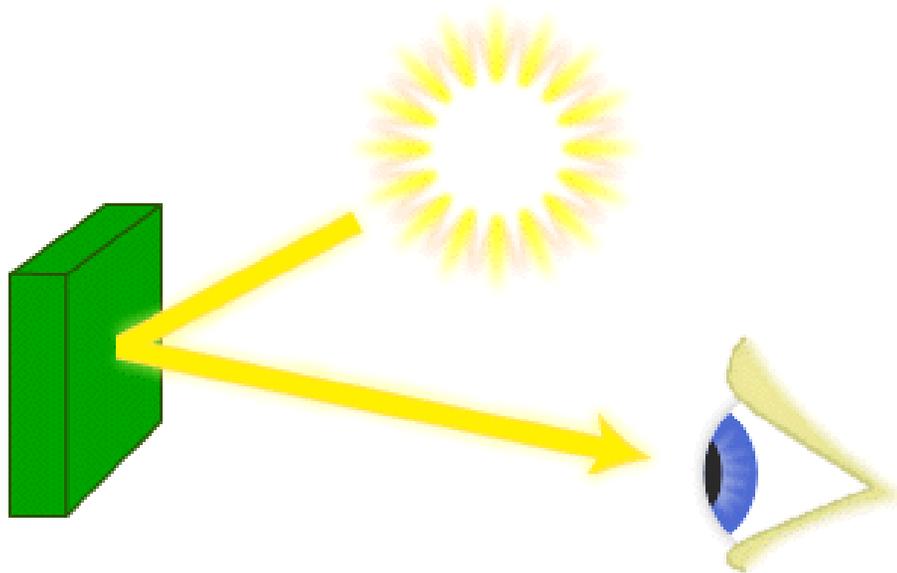
“Image Processing”

Willy Wriggers, Ph.D.

School of Health Information Sciences

<http://biomachina.org/courses/processing/12.html>

# Human Vision



# Human Vision

Some properties of human vision that affect image perception:

- Linear and non-linear parts
- Non-linear (approx. logarithmic) encoding of input
- Adaptation
- Relative-contrast encoding
- Varying sensitivity to spatial frequencies
- Generally treats brightness and color separately

# Discrimination Experiments

Many vision experiments involve comparisons

“Two alternative, forced choice” (2-AFC) experiments:

- Is there a difference? (yes/no)
- Which is brighter, farther apart, etc. (top/bottom, left/right, etc.)

Random guessing without bias: 50% correct

Pick some percentage above which the observer must get it right:  
often 75% (half the time they “see it”, half the time they guess)

Vary experimental parameter to determine the threshold  $T$  above which the observer reaches this desired level of confidence

This is called the just noticeable difference (JND)

Sensitivity:  $1/T$

# Weber's Law

Many visual properties obey Weber's Law

For intensity discrimination:

$$\frac{\Delta I}{I} = c$$

for some constant  $c$

In other words, *the JND  $\Delta I$  for intensity is proportional to the intensity itself*

Also applies to distance judgments, spatial frequency discrimination, and many others

Example: 1 mile vs. 2 miles; 51 miles vs. 52 miles!

# Weber's Law and Logarithmic Encoding

$$\begin{aligned}\log(I + \Delta I) - \log I &= \log\left(\frac{I + \Delta I}{I}\right) \\ &= \log(1 + c) \\ &= \text{constant}\end{aligned}$$

Differences of logarithmic encoding produces Weber's Law

The human intensity sensitivity function isn't exactly logarithmic, but it's close enough to be a useful model

# Adaptation

Our eyes have an incredible ability to adapt to lighting conditions

Total JND steps for the eye is about 1000

Total JND steps for fixed adaptation is about 200

# Contrast Encoding

The response of the eye to light isn't absolute – it's relative to the surrounding intensities

This causes the *Mach effect* at strong intensity transitions:



Even our color perception seems to be, to a degree, based on relative differences

Intensity: measurable light

Brightness: the perceived illumination

# Spatial Frequencies

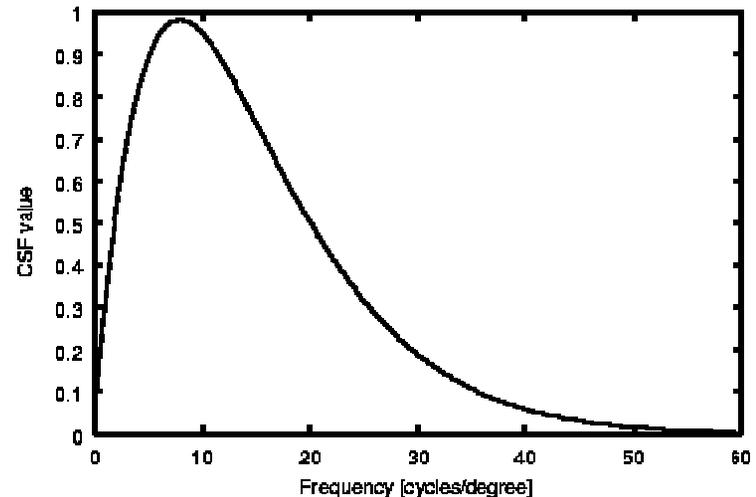
Stimulus: sinusoidal grating of some frequency  $f$  and amplitude  $A$

Vary  $A$  in a 2-AFC and find the JND for each frequency  $f$

Plot the sensitivity as a function of frequency  $f$ : the contrast sensitivity function (CSF)

Implications:

- The eye is less sensitive to extremely gradual changes
- The eye is fairly sensitive to more rapid changes
- The eye is decreasingly sensitive to yet higher spatial frequencies



# Brightness vs. Color

- The human visual system seems to treat brightness and color separately
- Physically separate pathways in the visual cortex ([brain](#))
  - Some crossover, but weak
- Perception of shape and form seems to be based on brightness, not color
- Much more sensitive to changes in brightness than to changes in color

# Time-Dependent Limitations

Incomplete capture of time-dependent images or scenes:

- Change blindness:

<http://www.usd.edu/psyc301/ChangeBlindness.htm>

- Motion induced blindness:

[http://www.michaelbach.de/ot/mot\\_mib](http://www.michaelbach.de/ot/mot_mib)

- More visual illusions:

<http://www.michaelbach.de/ot>

# Displays

When building visual displays you have to consider properties of human vision:

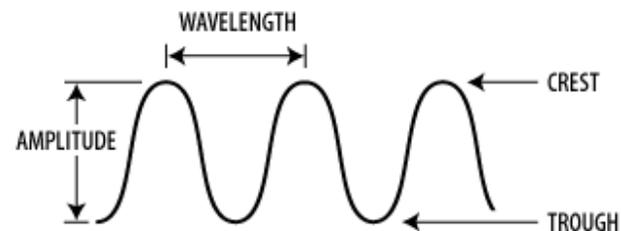
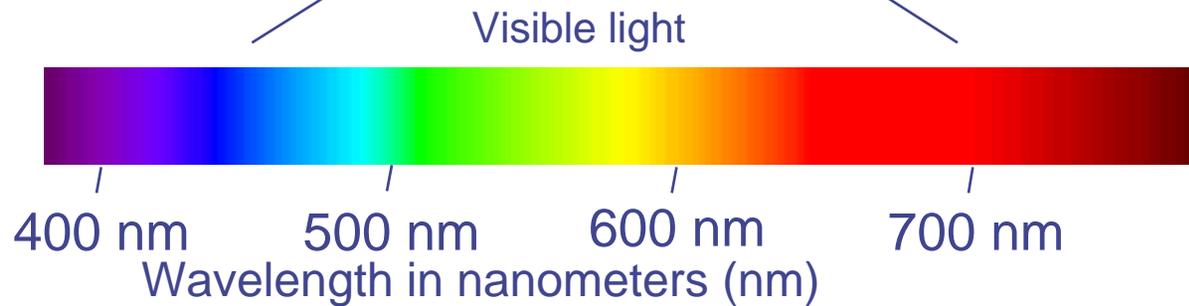
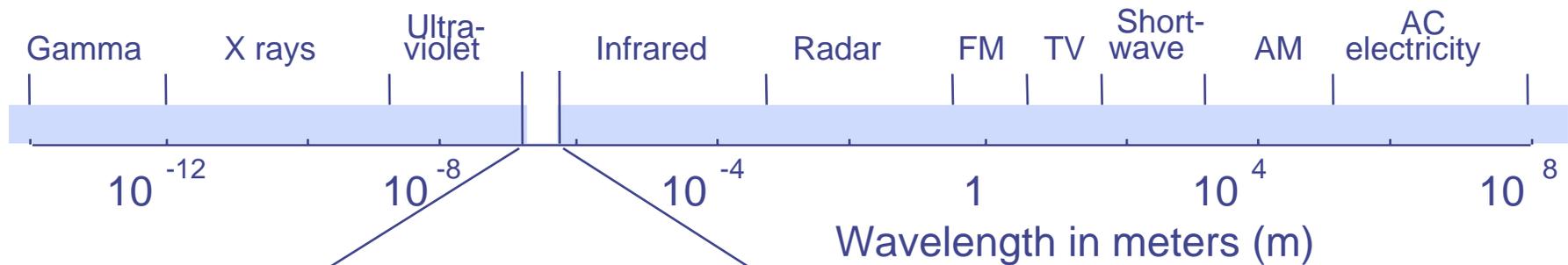
- Exponential encoding for perceptual linearization
- Be careful of Mach effects
- Consider adaptation
- Make it bright!
- Consider the human CSF
- Be careful with color

# Color

# What is Color?

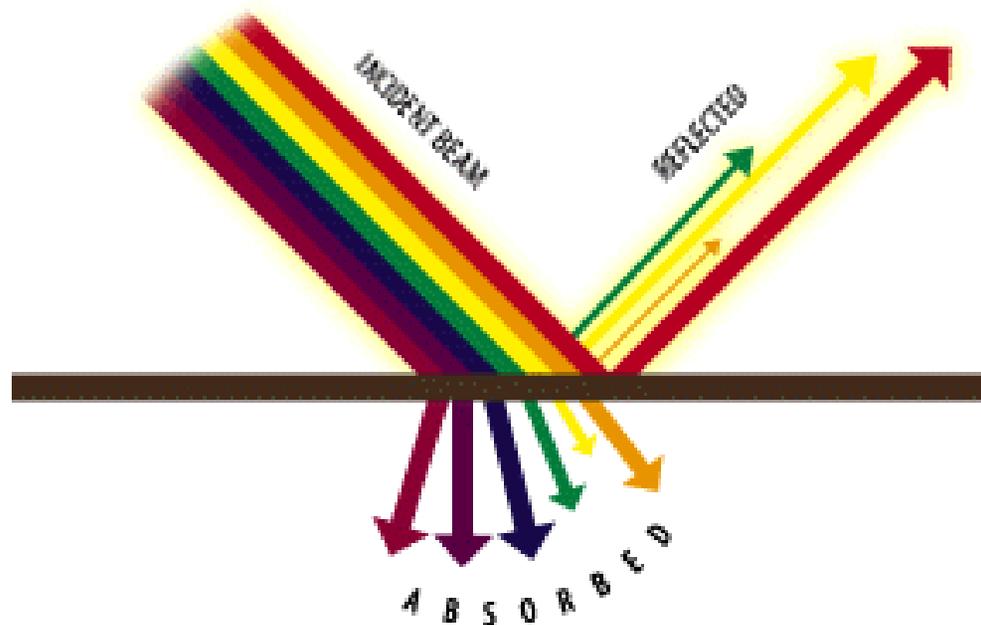
- Color is the spectrum of light being perceived by the human visual system
- Visible light is electromagnetic energy in the 400 to 700 nm wavelength range of the spectrum
- Why discuss color?
  - Many ways to talk about color: tint, shade, hue, brightness, luminance, color, chromaticity, ...
  - Useful to understand how the eye perceives color

# Electromagnetic Radiation - Spectrum



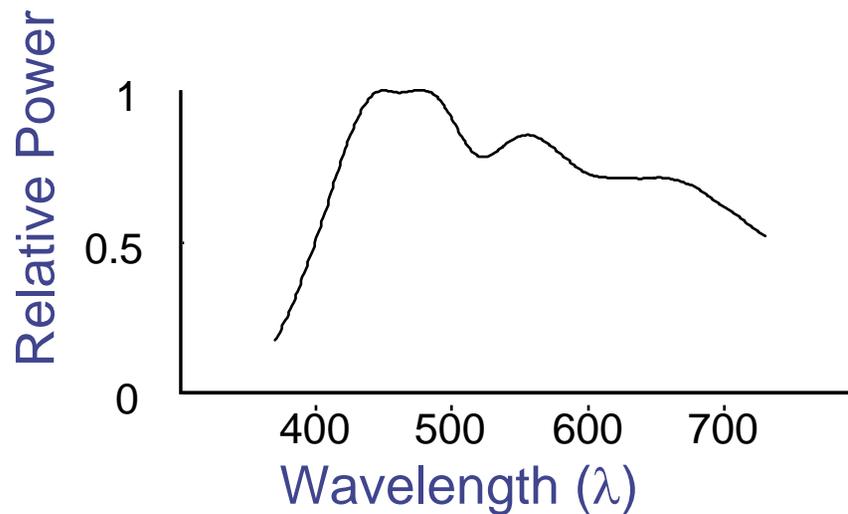
# The Interaction of Light and Matter

- Some or all of the light may be absorbed depending on the pigmentation of the object.

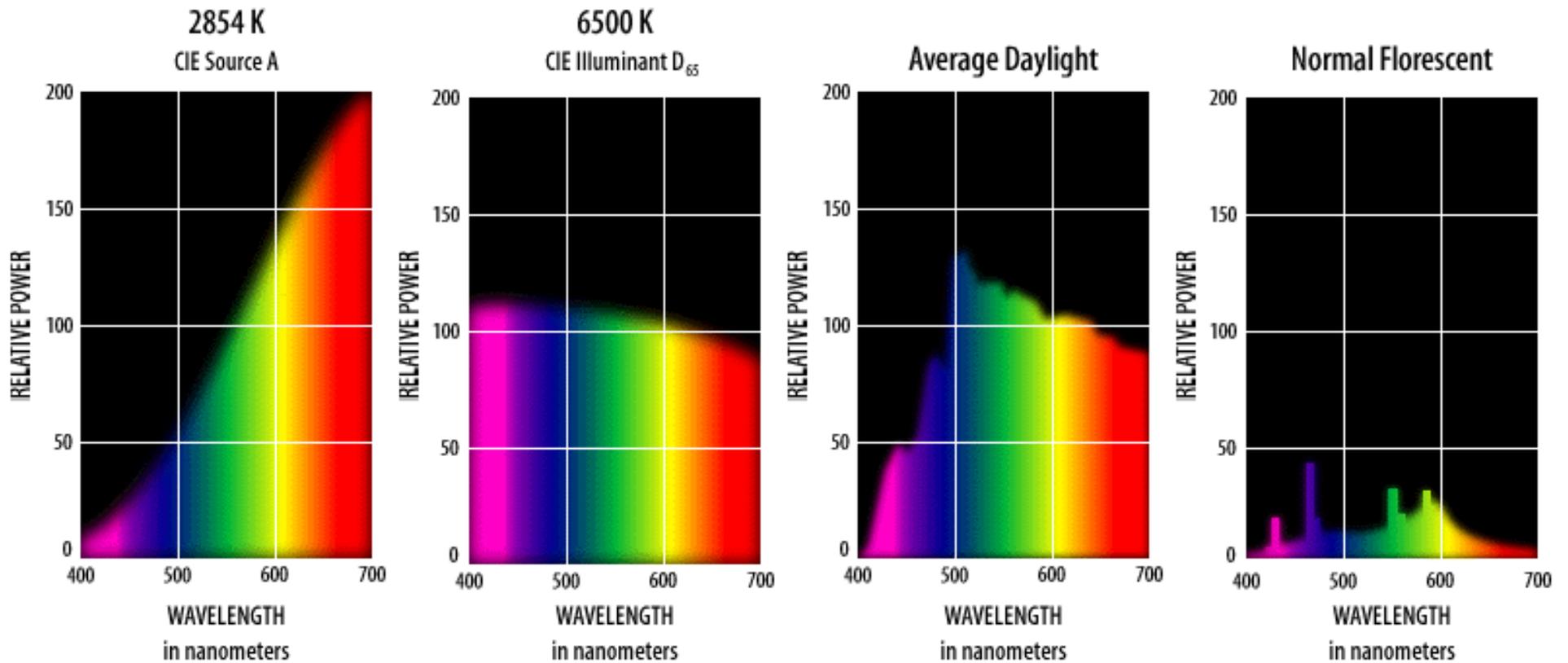


# Spectral Power Distribution

- The **Spectral Power Distribution** (SPD) of a light is a function  $P(\lambda)$  which defines the power in the light at each wavelength

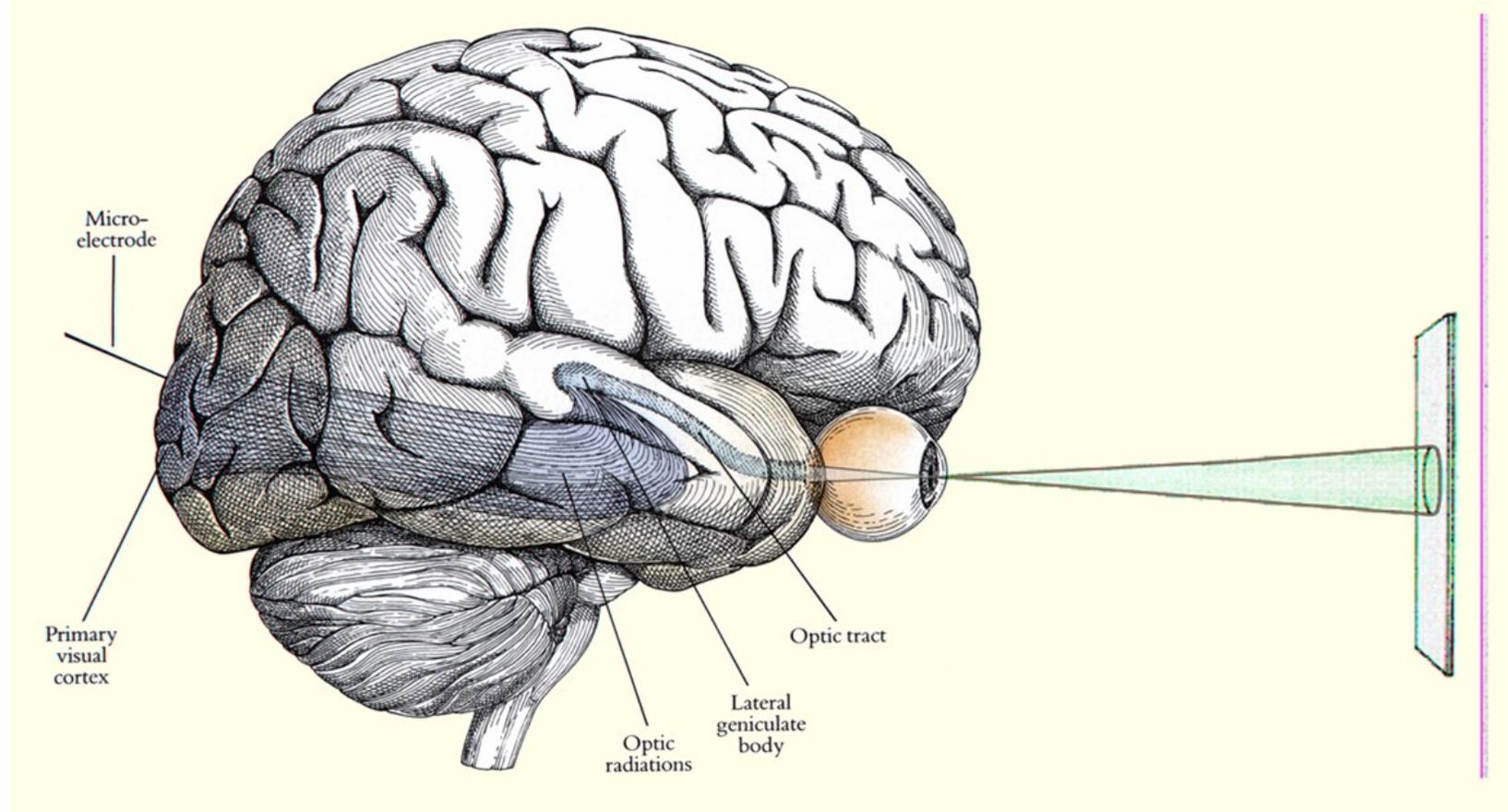


# Examples

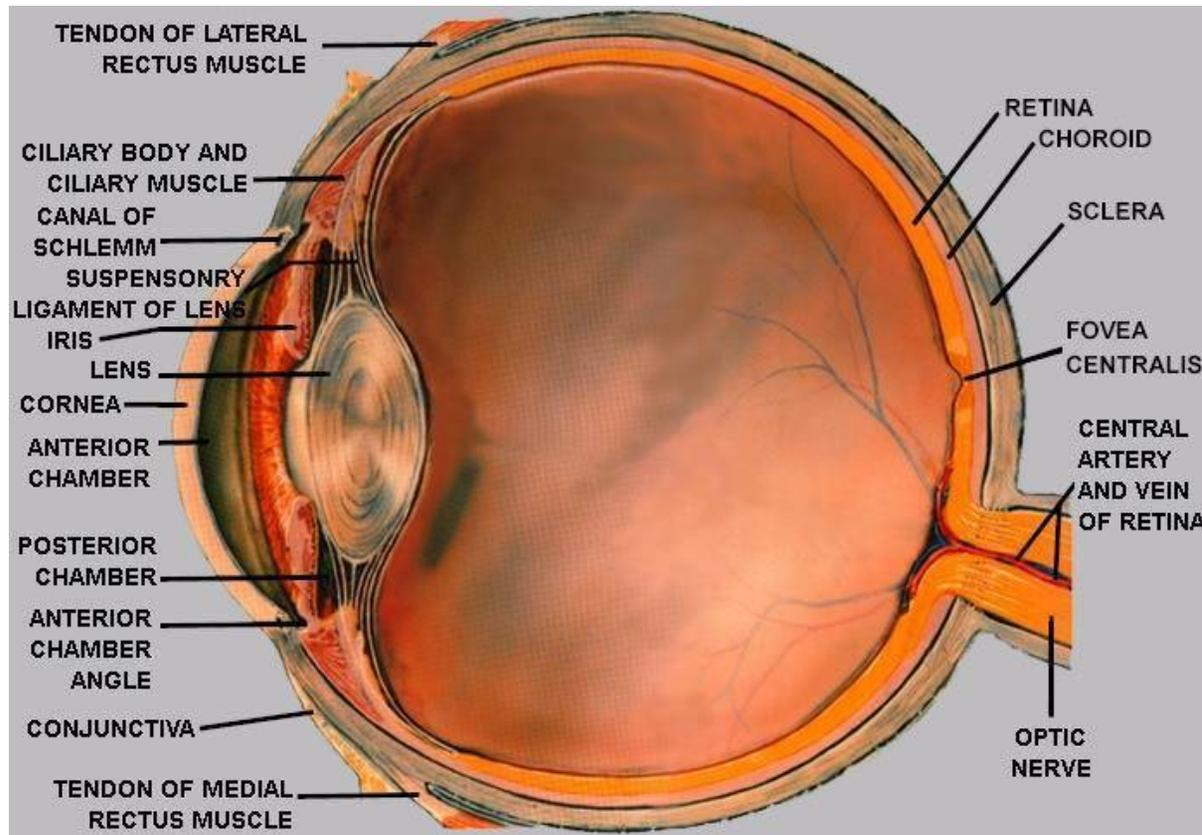


# Color Receptors and the Eye

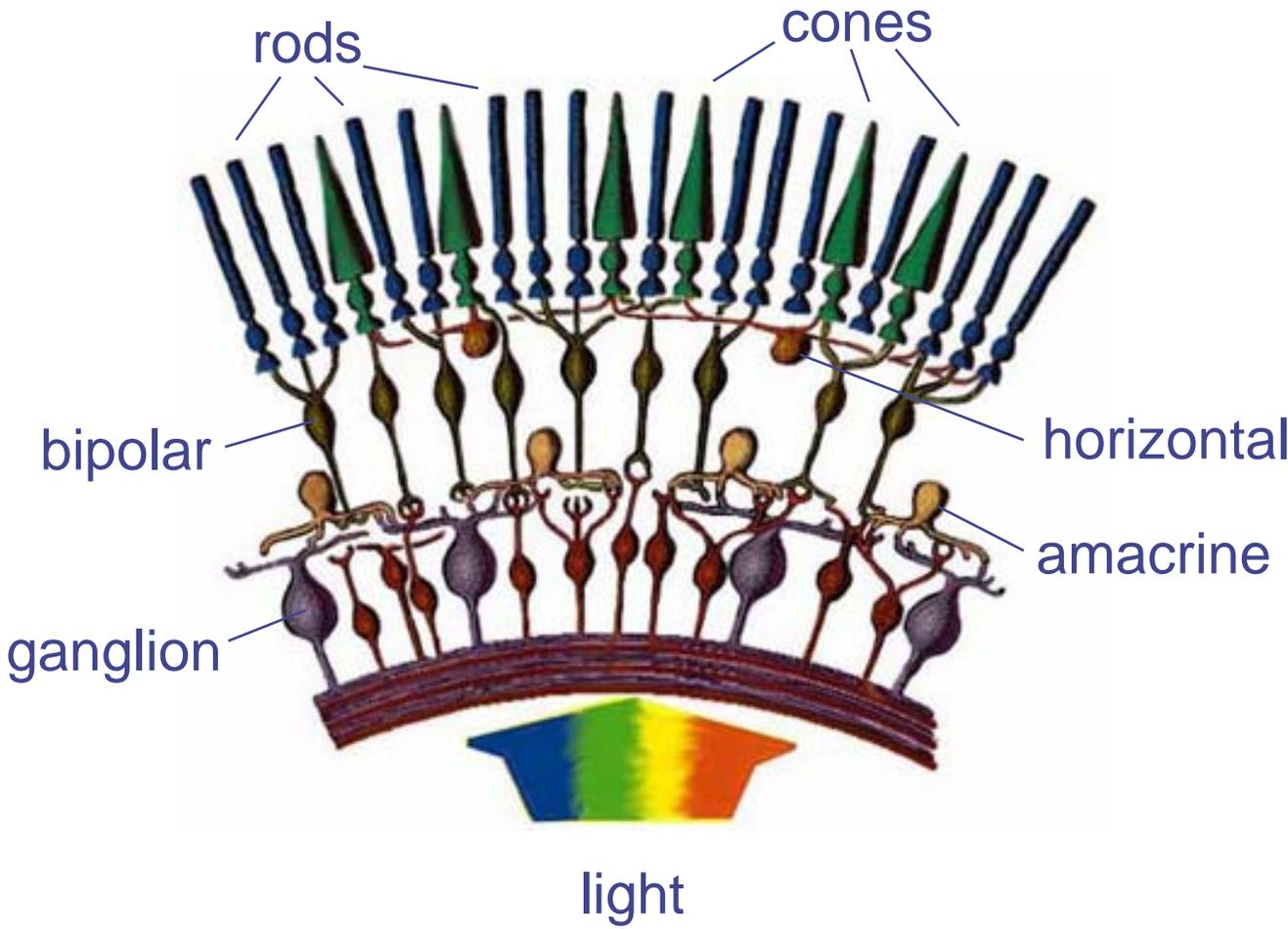
# The Physiology of Human Vision



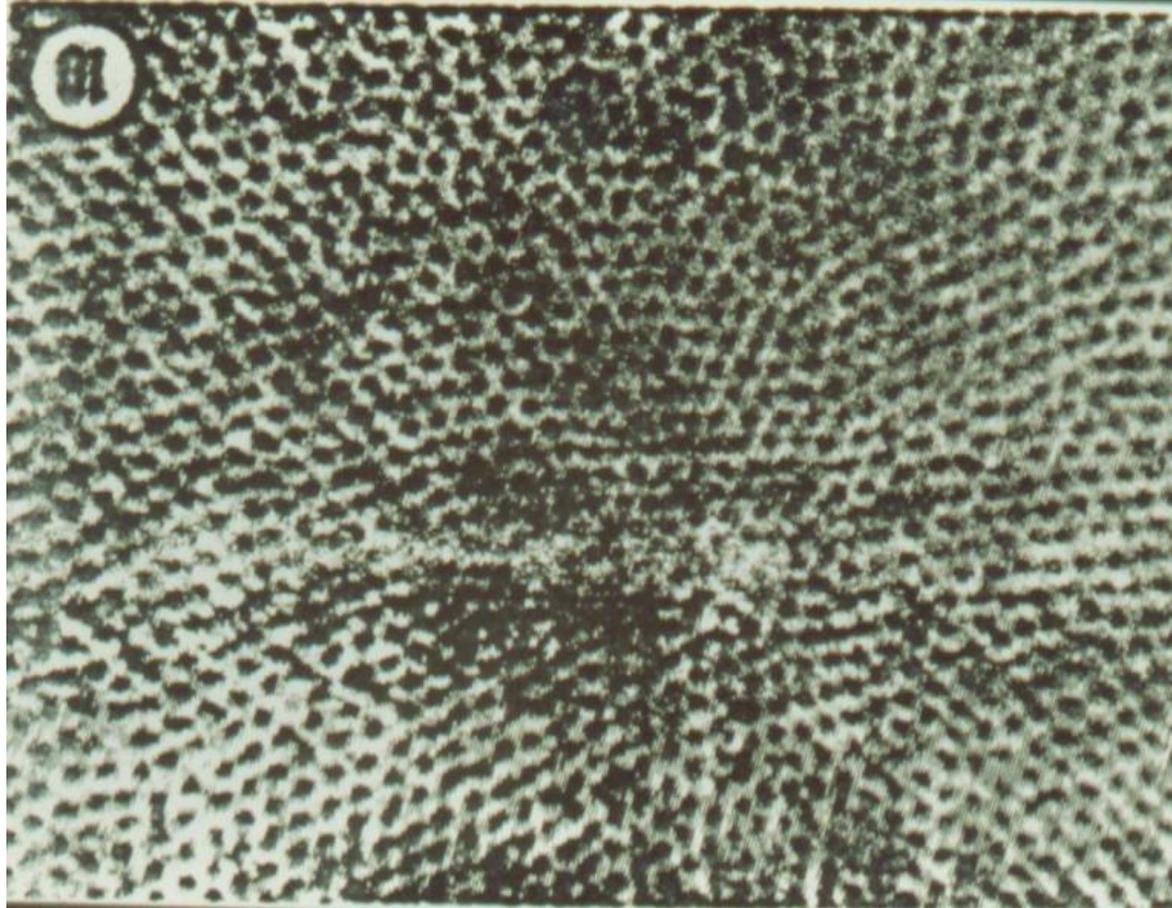
# The Human Eye



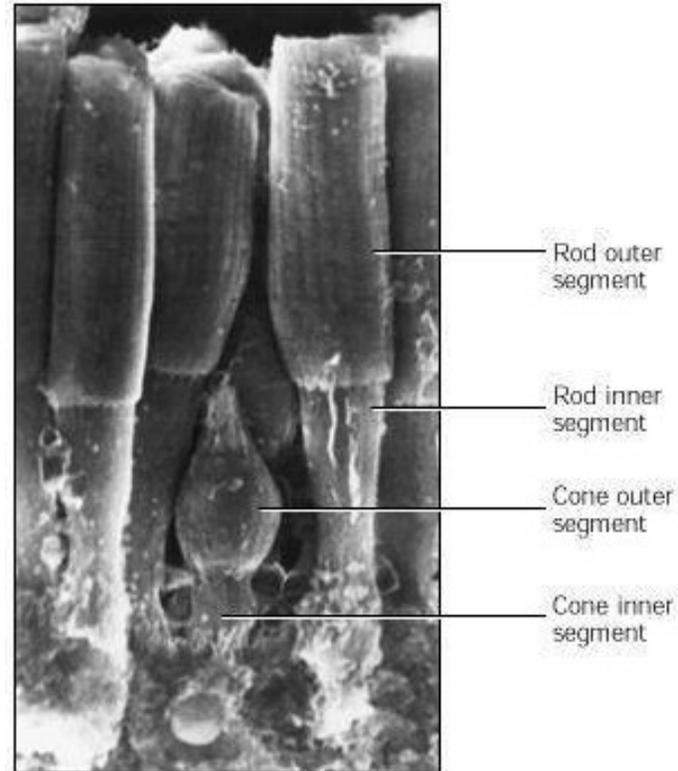
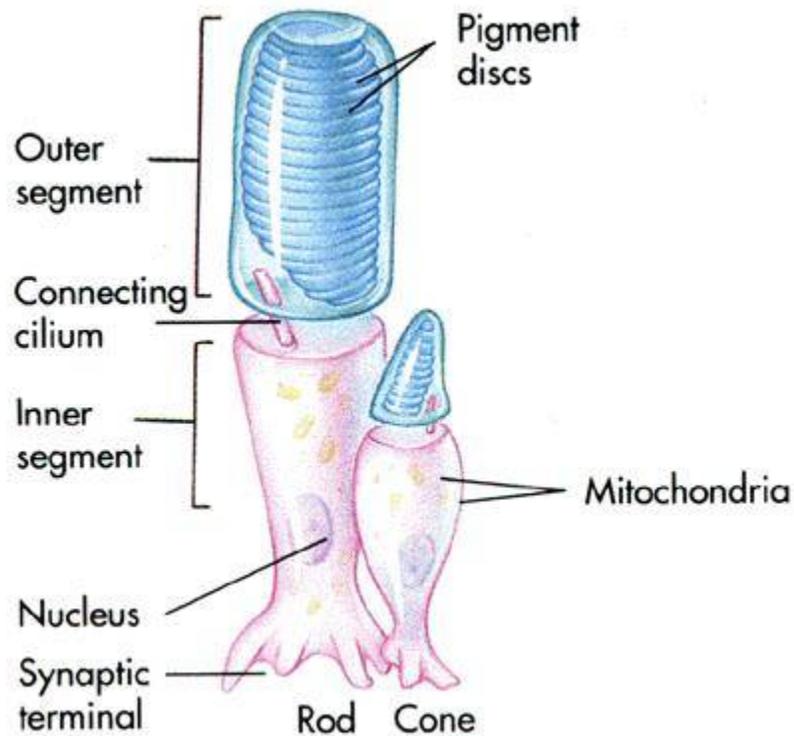
# The Human Retina



# The Human Retina



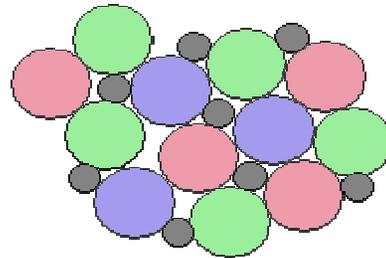
# Retinal Photoreceptors



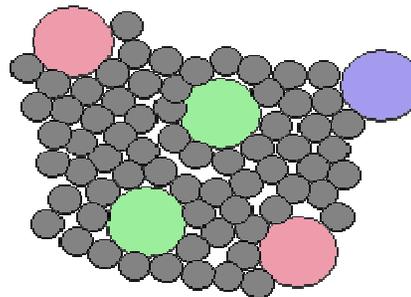
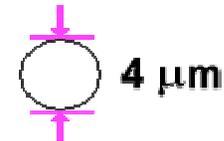
- Outer segments contain the photopigment rhodopsin
- Light absorption induces conformational changes in rhodopsin
- Second messenger cascade (reduced cGMP concentration)
- Closing of cation channels leads to hyperpolarization of photoreceptor
- Receptor currents evoked by decreased neurotransmitter at synaptic terminals

# Cones

- High illumination levels (Photopic vision)
- Less sensitive than rods.
- 5 million cones in each eye.
- Density decreases with distance from fovea.



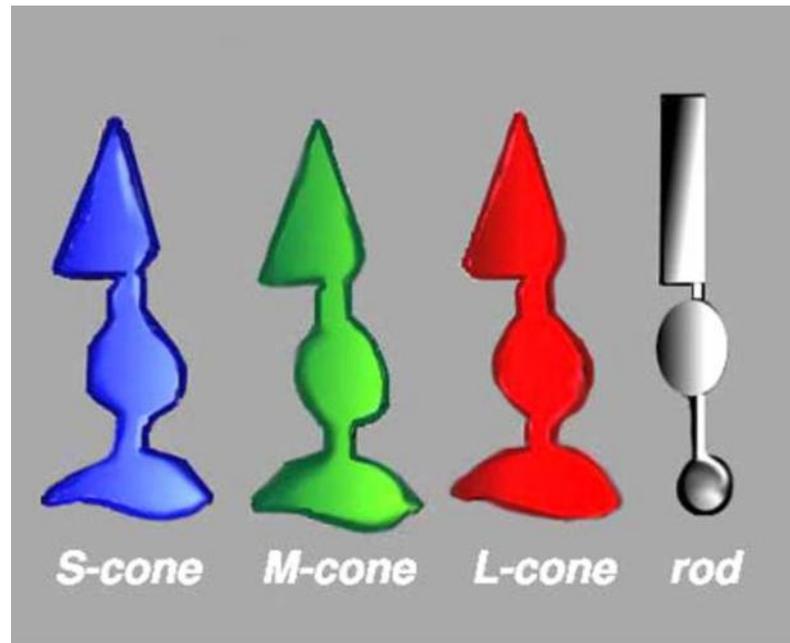
**1.35 mm from retina center**



**8 mm from retina center**

# 3 Types of Cones

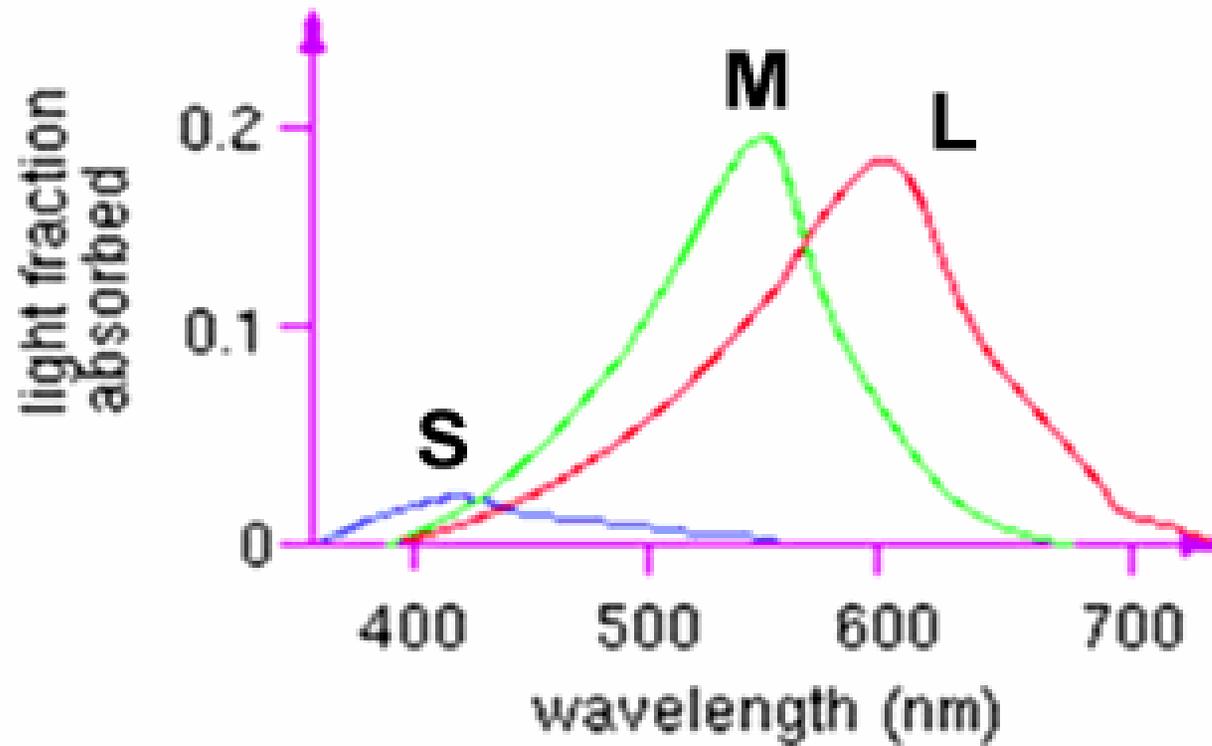
- **L-cones**, most sensitive to red light (610 nm)
- **M-cones**, most sensitive to green light (560 nm)
- **S-cones**, most sensitive to blue light (430 nm)



# Color Receptors

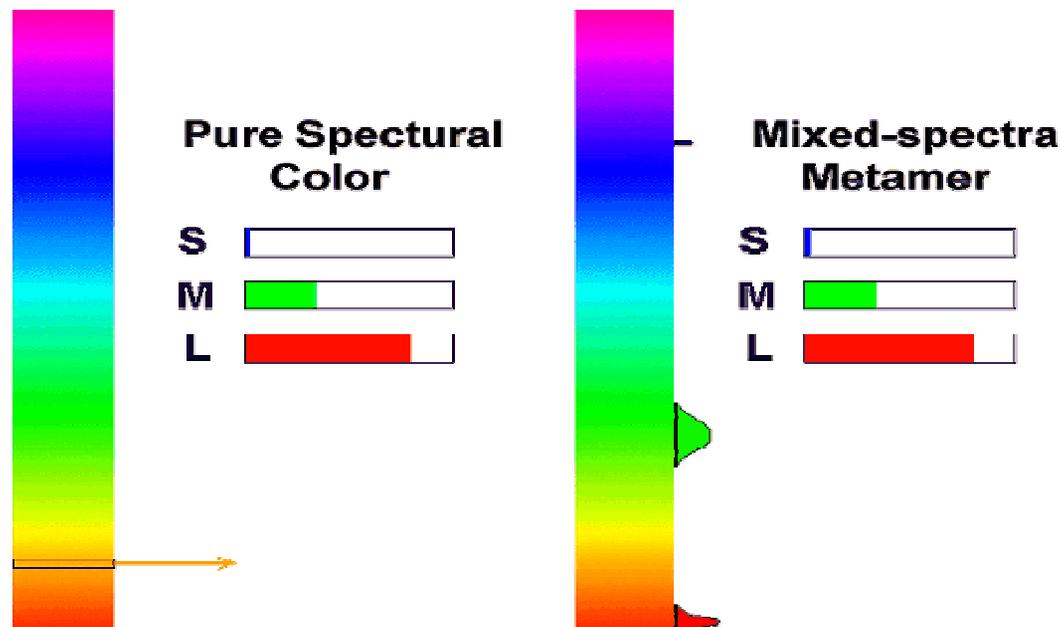
- Cones have three kinds of color-sensitive pigments, each responding to a different range of wavelengths
- These are roughly “red”, “green” and “blue” in their peak response but each responds to a wide range of wavelengths
- The combination of the responses of these different receptors gives us our color perception
- This is called the tri-stimulus model of color vision

# Cones Spectral Sensitivity



# Metamers

- Two lights that appear the same visually. They might have different SPDs (spectral power distributions)



# Color Spaces

# History

- Thomas Young (1773-1829)

*“A few different retinal receptors operating with different wavelength sensitivities will allow humans to perceive the number of colors that they do. “*

- James Clerk Maxwell (1872)

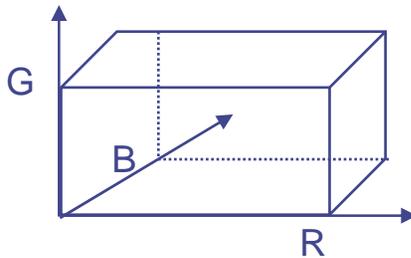
*“We are capable of feeling three different color sensations. Light of different kinds excites three sensations in different proportions, and it is by the different combinations of these three primary sensations that all the varieties of visible color are produced. “*

- Trichromatic: “Tri”=three “chroma”=color

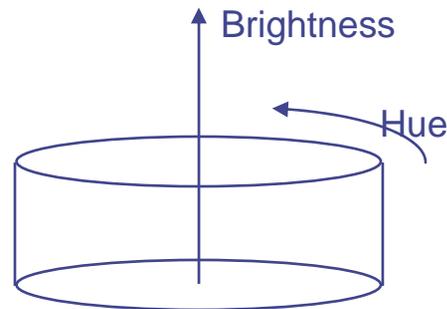
# 3D Color Spaces

- Three types of cones suggests color is a 3D quantity. How to define 3D color space?

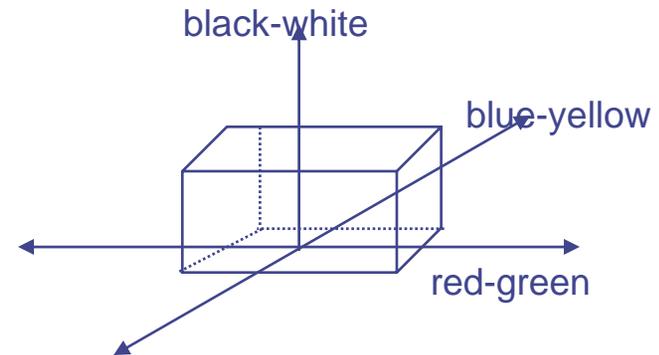
Cubic Color Spaces



Polar Color Spaces



Opponent Color Spaces



# The RGB Color Model

- The simplest color model is to attempt to model these three stimulus values: red, green, blue
- 24-bit color: one byte each for red, green, and blue
- Each is called a channel



# Luminance and Chromaticity

RGB isn't the most intuitive model of color

Artists usually think of dark/light and color as two different things:

- Luminance
- Chromaticity

# Luminance

- Luminance
  - Intensity
  - Brightness
  - Lightness
  - Luma
  - Value
- All refer to the light/dark properties of the stimulus
  - Some models use linear, non-linear, or perceptually linear encoding

# Chromaticity

Requires two parameters

Example:

- Hue → The dominant wavelength
- Saturation → How pure/deep that color is relative to gray

Note: Some models use different chromaticity parameters

# CIE XYZ

- CIE:
  - In French: Commission Internationale de l'Eclairage
  - In English: International Commission on Illumination
- Not the same as RGB and not tied to hardware
- Describes the entire visible gamut
  - Two chromaticity (similar to hue or color) values:  $X$  and  $Z$
  - One luminous efficiency (similar to intensity) value:  $Y$
- Provides a standard for sharing color information between disciplines
  - Computer graphics and fabric design

# The CIE Chromaticity Diagram

CIE uses three primaries,  $X$ ,  $Y$ , and  $Z$ , to replace red, green, and blue

$XYZ$  primaries computed from  $RGB$  (Rec. 709) through a linear transform:

$$\begin{bmatrix} X \\ Y \\ Z \end{bmatrix} = \begin{bmatrix} 0.412453 & 0.357580 & 0.180423 \\ 0.212671 & 0.715160 & 0.072169 \\ 0.019334 & 0.119193 & 0.950227 \end{bmatrix} \begin{bmatrix} R_{709} \\ G_{709} \\ B_{709} \end{bmatrix}$$

Normalized CIE primaries:

$$x = \frac{X}{X + Y + Z} \quad y = \frac{Y}{X + Y + Z} \quad z = \frac{Z}{X + Y + Z}$$

# The CIE Chromaticity Diagram

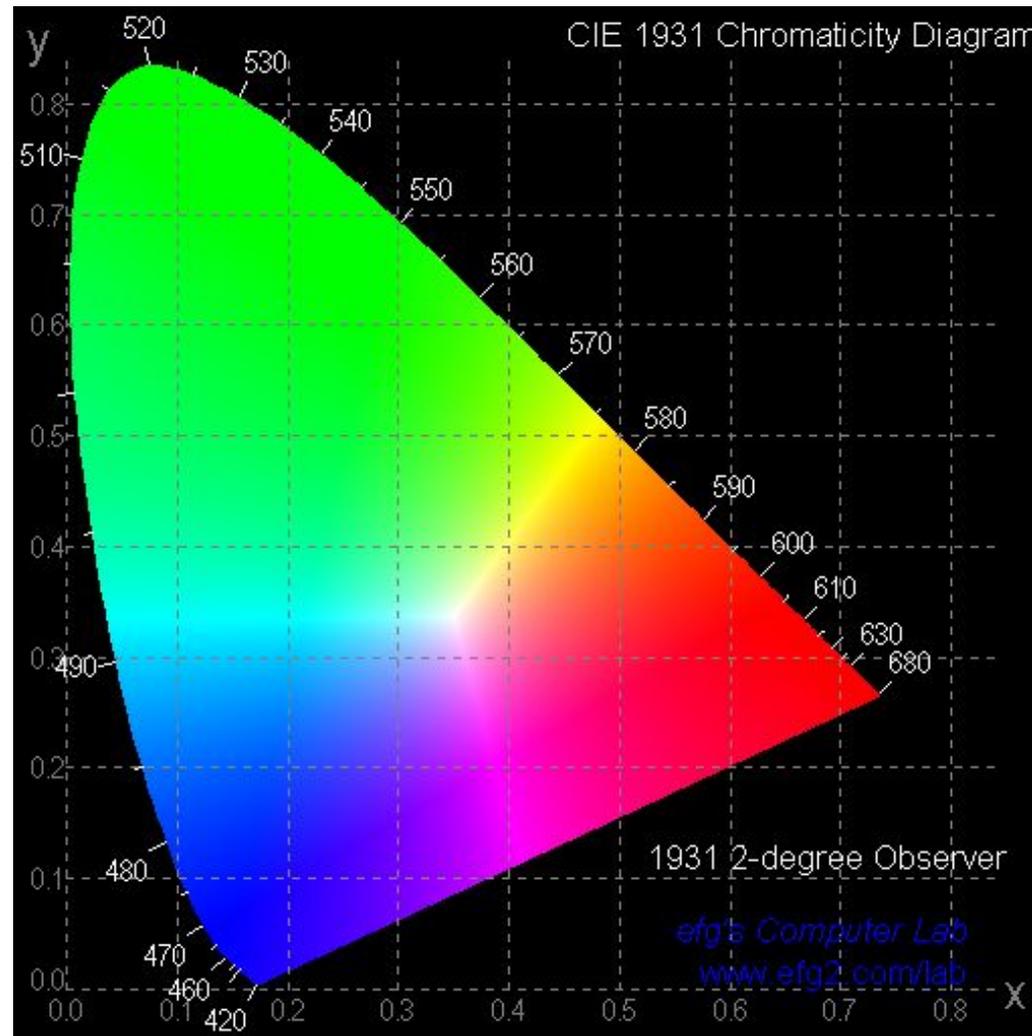
Consider the plane

$$x + y + z = 1$$

Every point on this plane can be characterized by unique  $x$  and  $y$   
( $z = 1 - x - y$ )

Plotting on this plane the color of each wavelength gives the CIE chromaticity diagram

# The CIE Chromaticity Diagram



# Color Gamuts

- The color space spanned by a set of primary (base) colors is called a color gamut
- Example: the space of all colors that can be displayed by a device with three color phosphors is the gamut of that device
- No three-primary color (with positive weights) spans the full space of perceivable colors!
- The CIE chromaticity diagram spans the gamut of human color vision
  - Recall that cones in the eye integrate over a wide range of wavelengths

# The RGB Model

When light is mixed, wavelengths combine (add)

The **Red-Green-Blue** (*RGB*) model is used most often for *additive models*

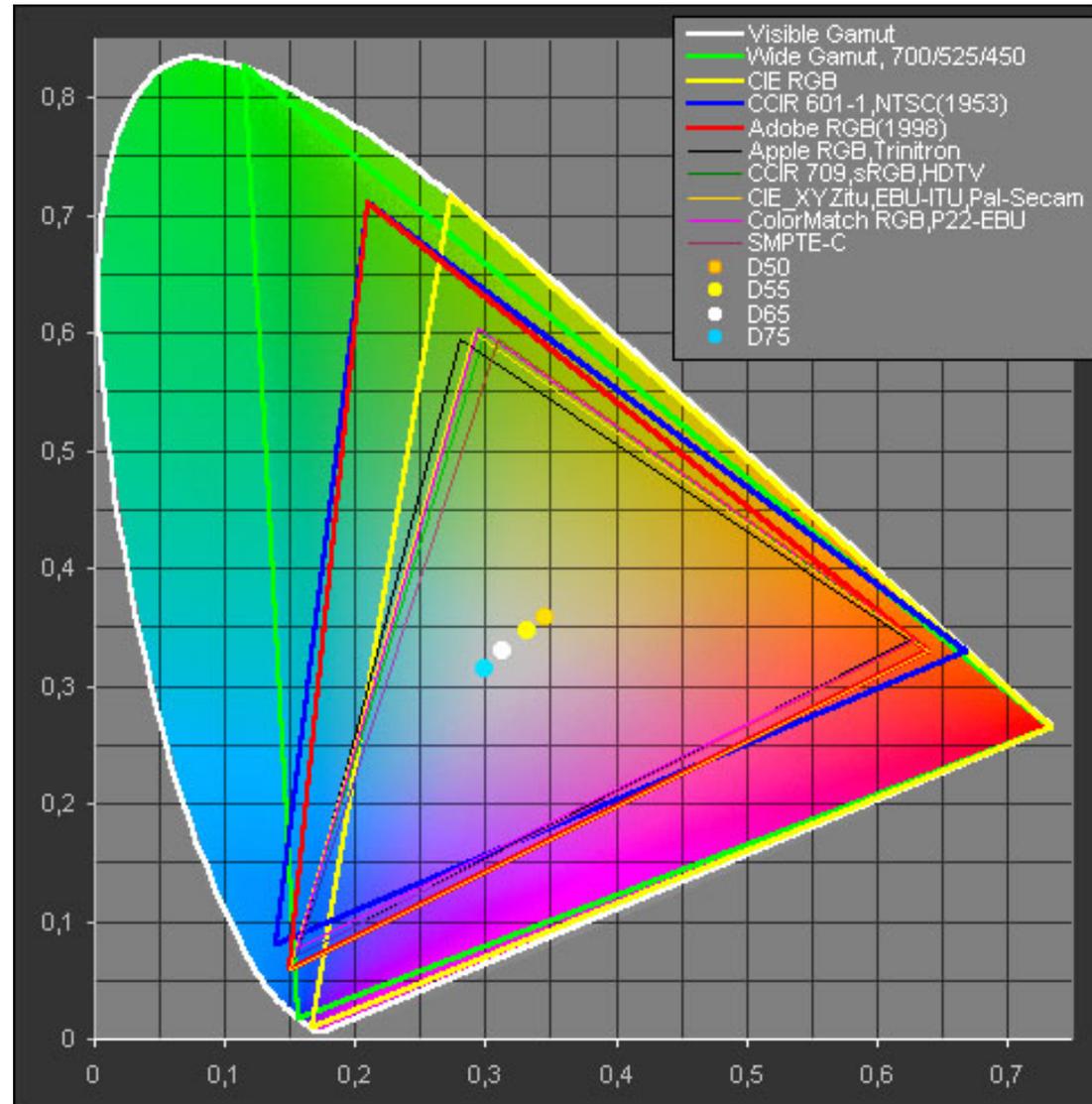
Adding a color and its complement create white

Primary	Complement
<i>Red</i>	<i>Cyan</i>
<i>Green</i>	<i>Magenta</i>
<i>Blue</i>	<i>Yellow</i>

# RGB Space

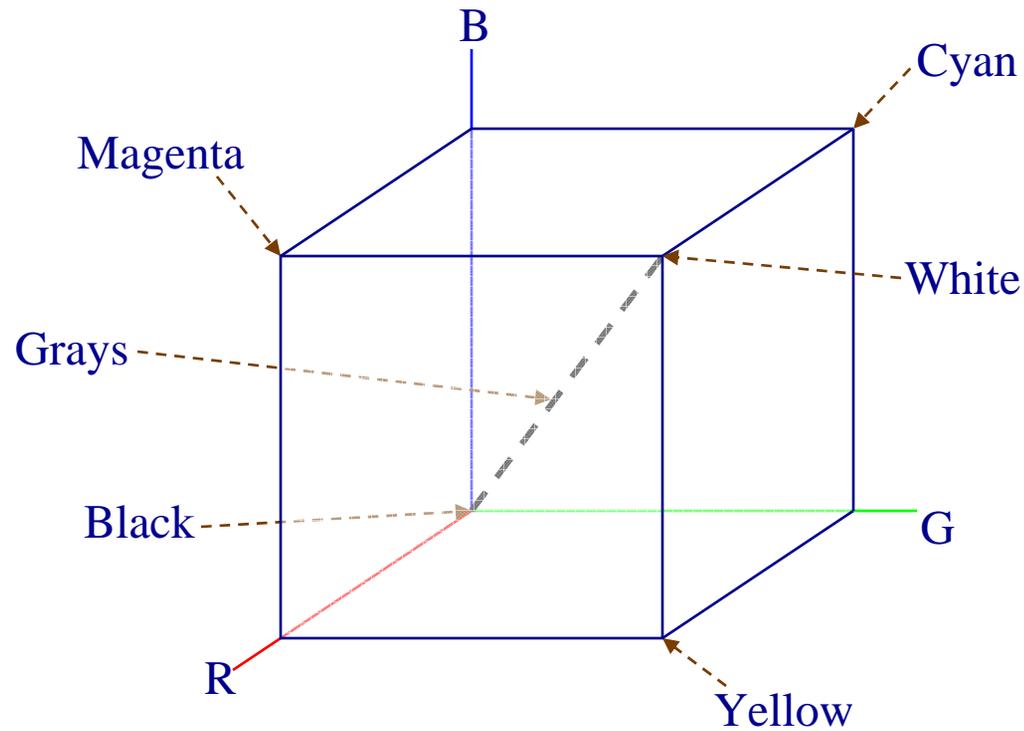
- Can't produce all visible colors
- Contained within CIE *XYZ*
- Additive to produce other colors
- Perfect for imaging since hardware uses three color phosphors

# Various RGB Color Spaces

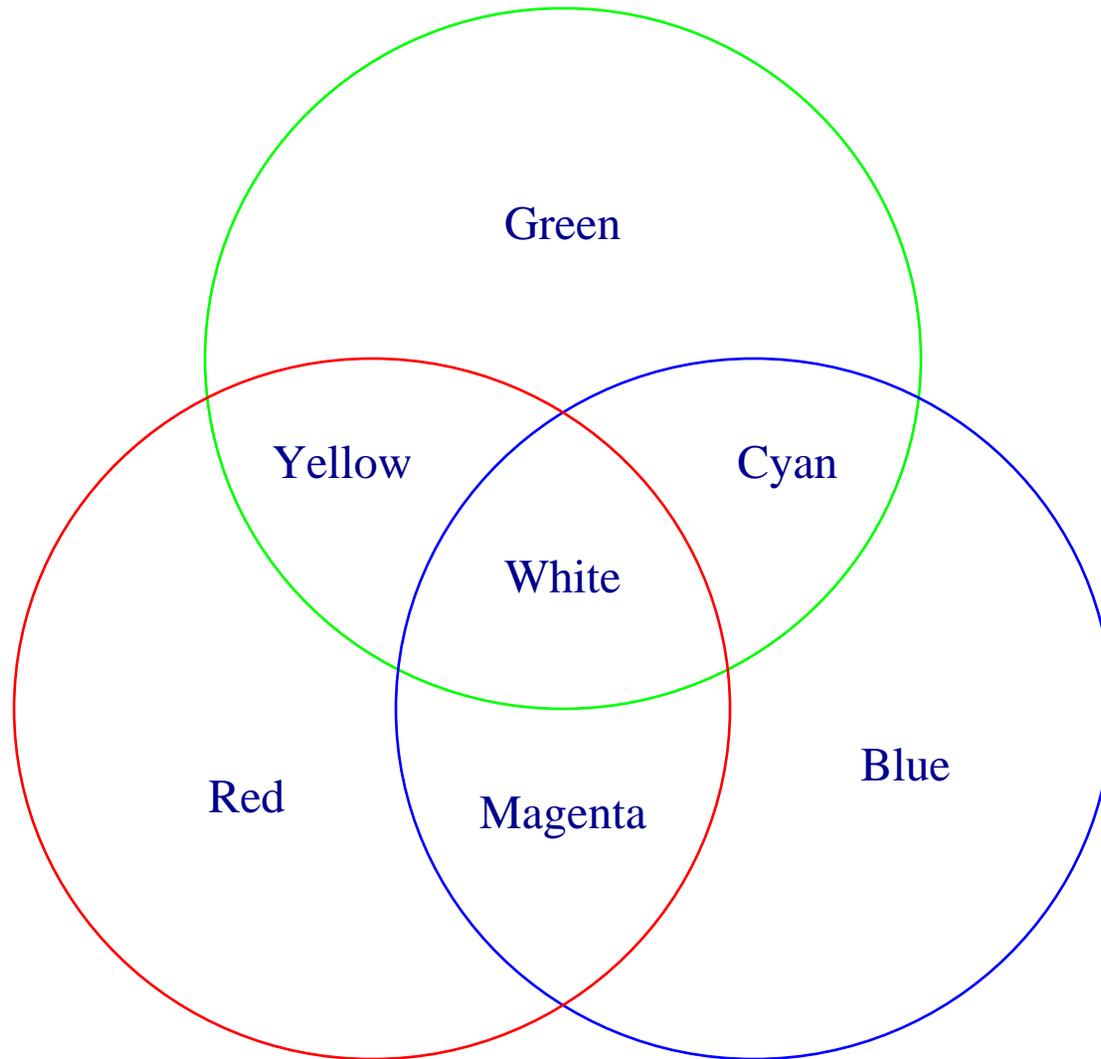


# RGB Color Space

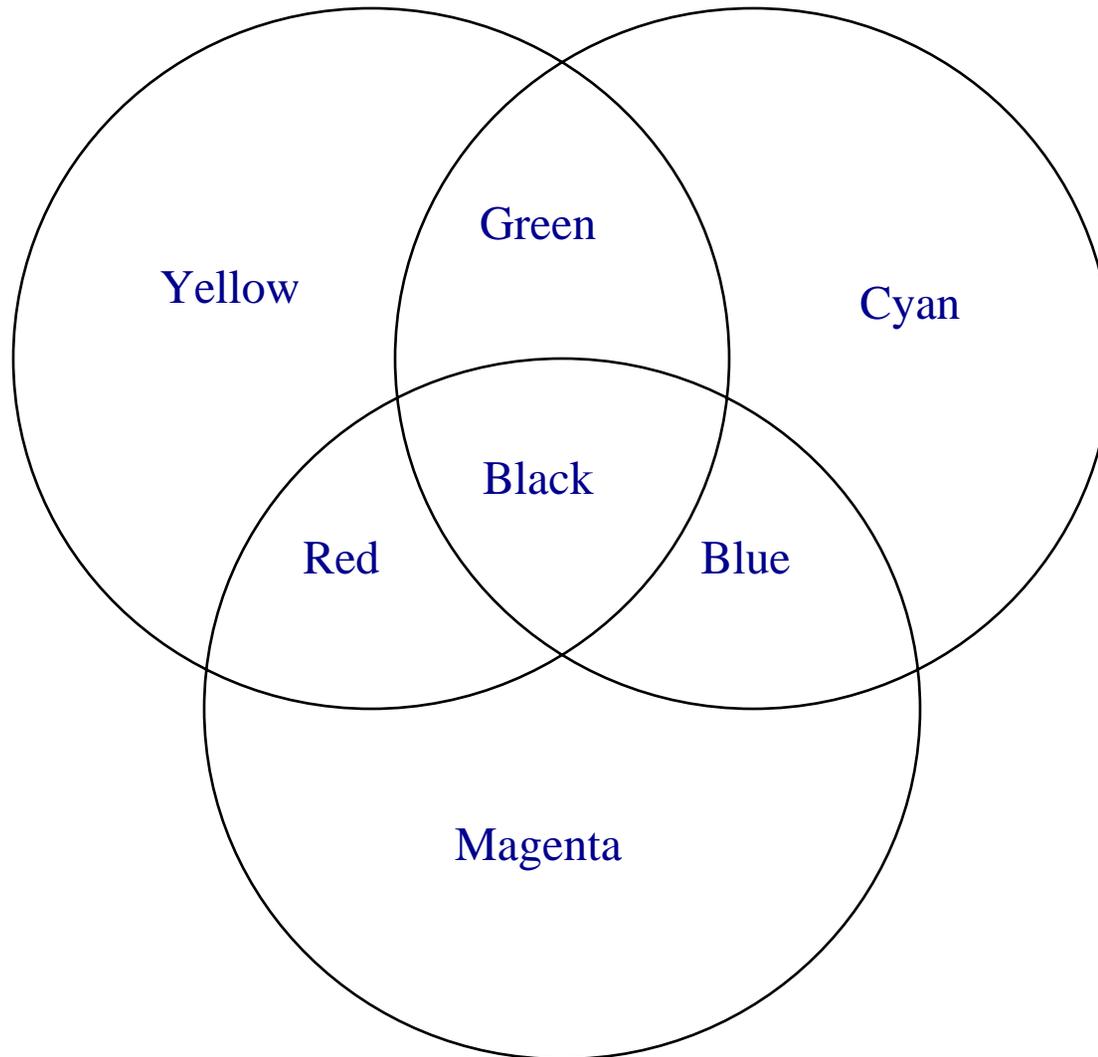
Subset of 3-D Cartesian space



# Additive Colors: *RGB*



# Subtractive Colors

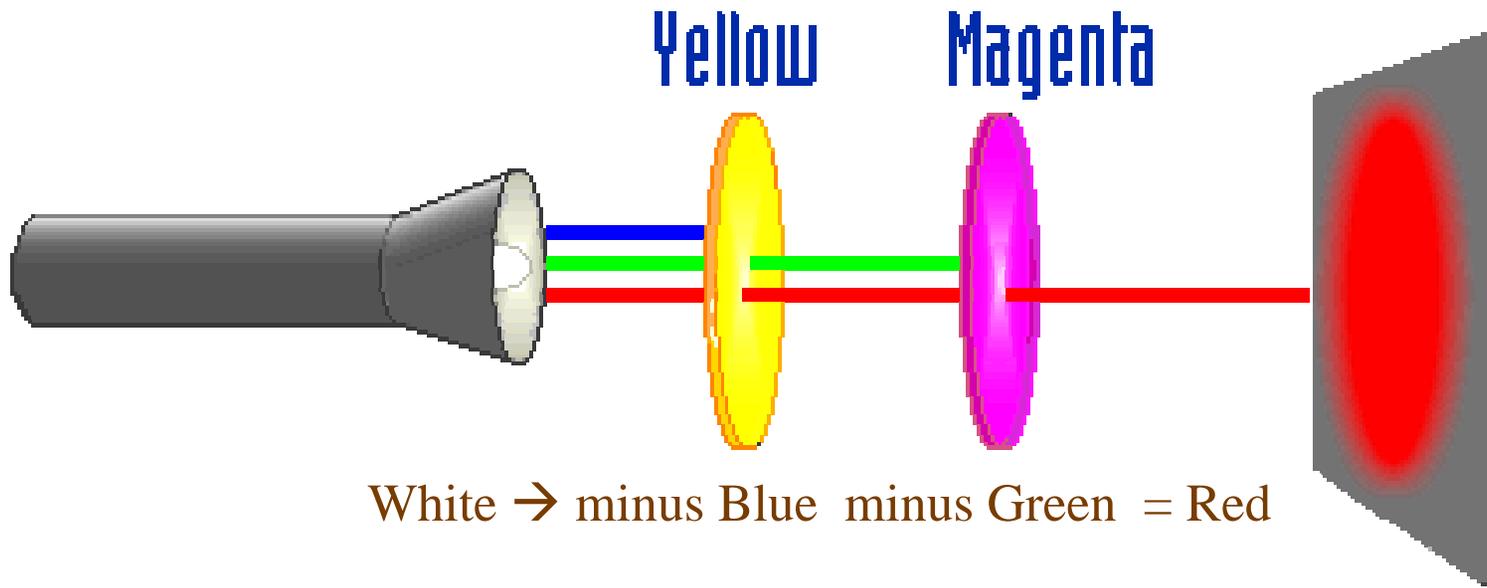


# The CMY Model

- Paint/ink/dye subtracts color from white light and reflects the rest
- Mixing paint pigments subtracts multiple colors
- The Cyan-Magenta-Yellow (*CMY*) model is the most common *subtractive model*
  - Same as RGB except white is at the origin and black is at the extent of the diagonal
- Very important for hardcopy devices

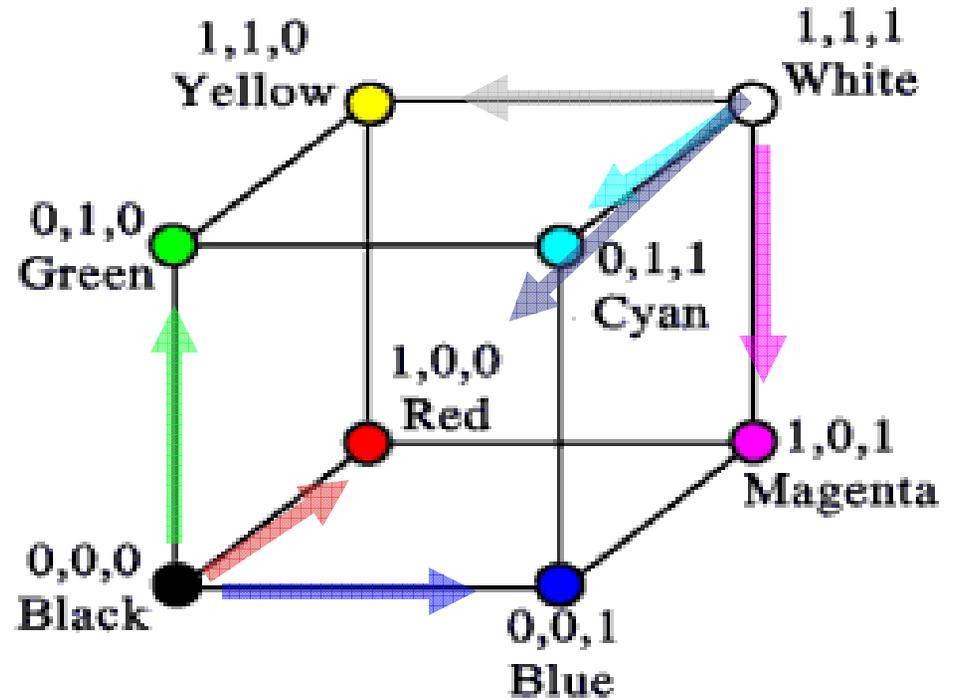
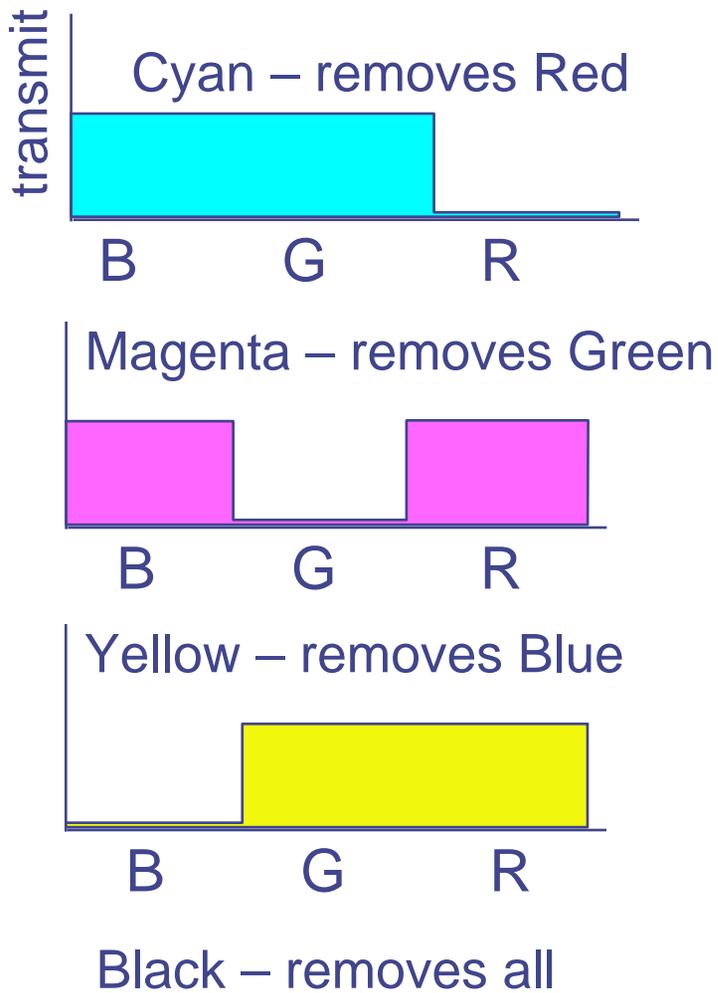
# CMY vs. RGB

$$\begin{bmatrix} C \\ M \\ Y \end{bmatrix} = \begin{bmatrix} 1 \\ 1 \\ 1 \end{bmatrix} - \begin{bmatrix} R \\ G \\ B \end{bmatrix}$$



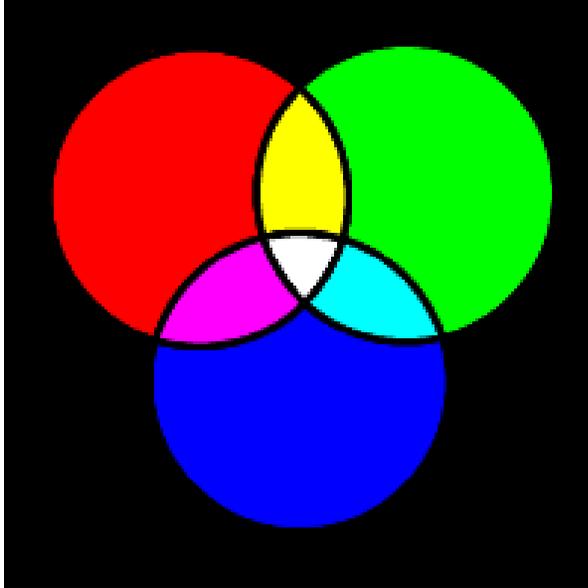
# CMY Color Model

CMY = Cyan, Magenta, Yellow

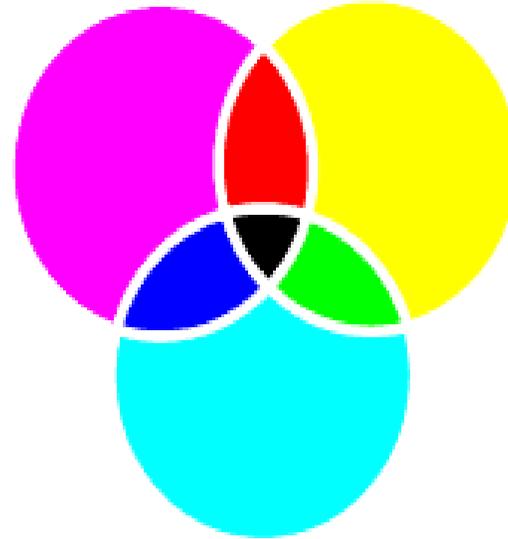


# Combining Colors

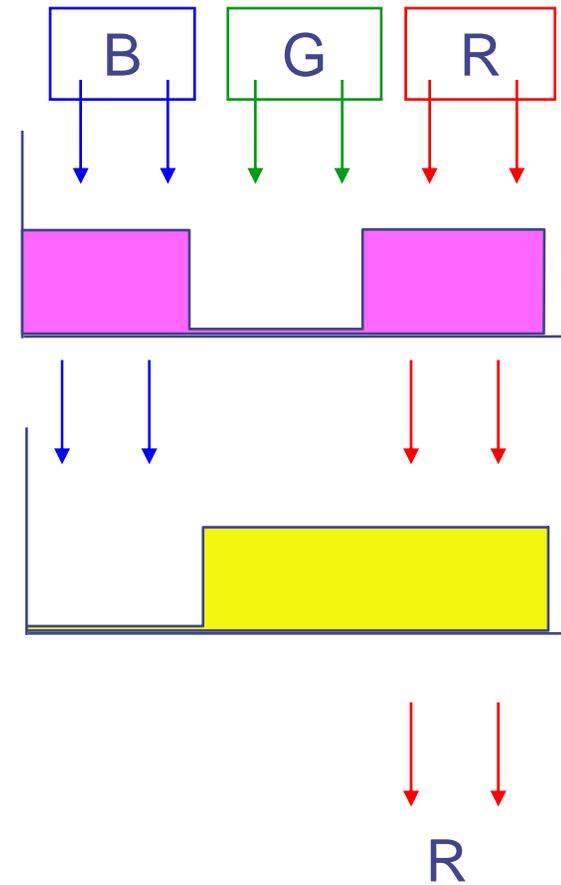
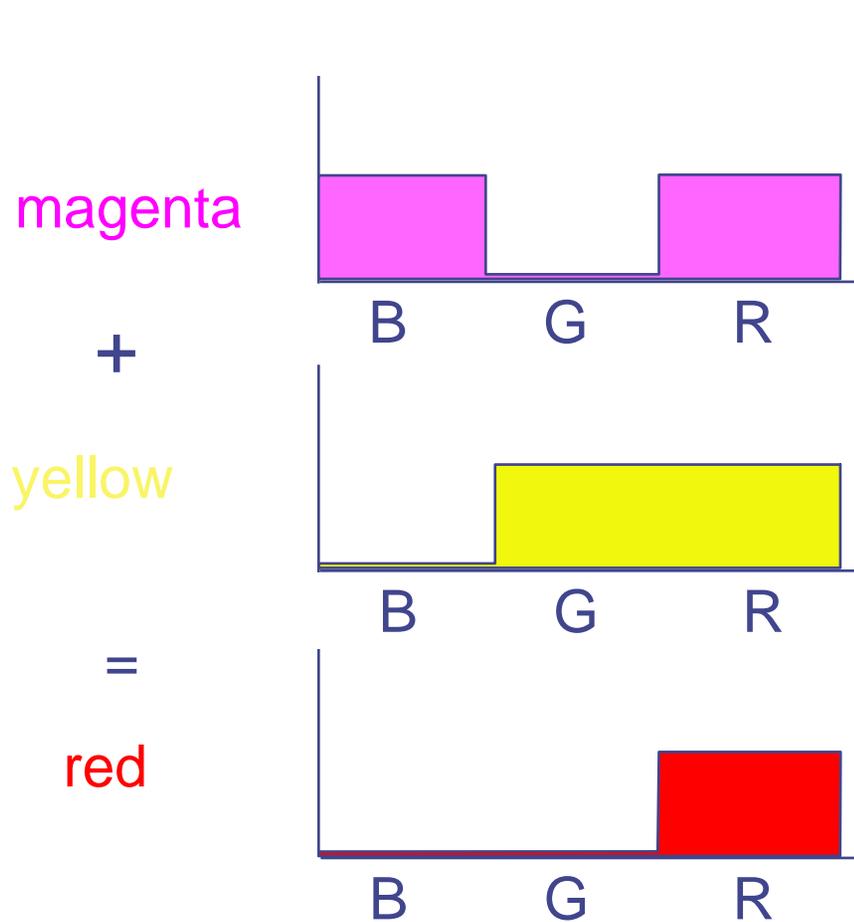
Additive (RGB)



Subtractive (CMY)



# Example: Red = Magenta + Yellow



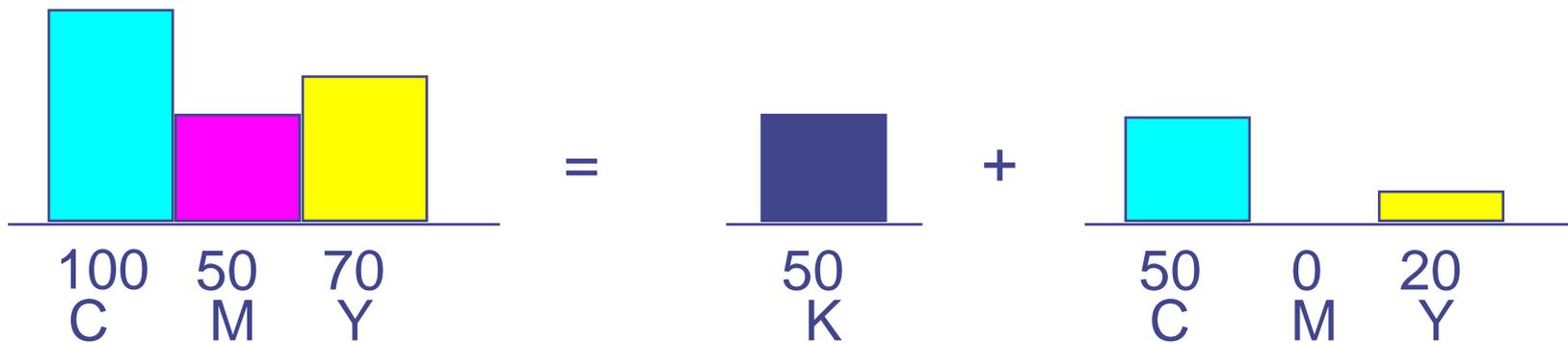
# The CMYK Model

- Black created by:
  - Adding a subtractive color and its complement
  - Adding all three subtractive colors
- Problem: paints/inks/dyes are imperfect, so it's hard to make pure black (especially a problem in print where black is used so often)
- $C+M+Y =$  dark brown not black
- Solution: add black ( $K$ ) as a fourth primary  $\rightarrow$  *CMYK* color model

# CMY + Black

$$C + M + Y = K \text{ (black)}$$

- Using separate ink for black is more economical
- Black instead of C+M+Y is crisper with more contrast



# Example



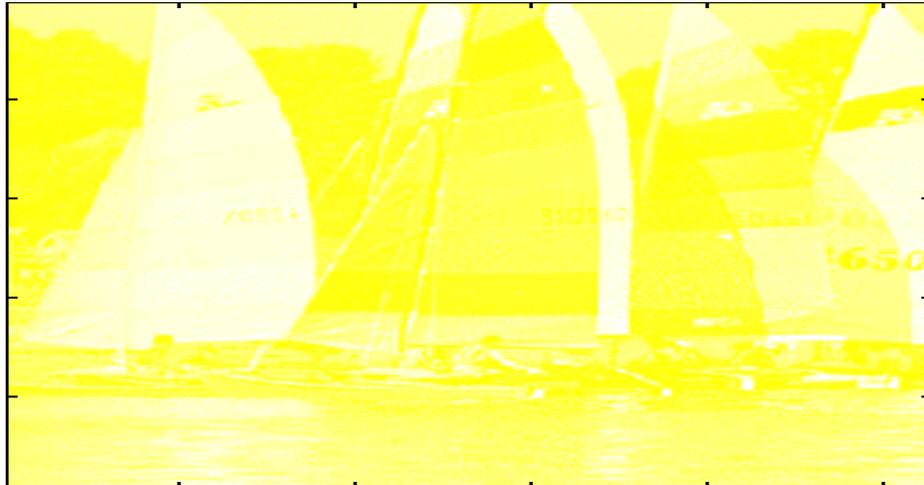
# Example



# Example



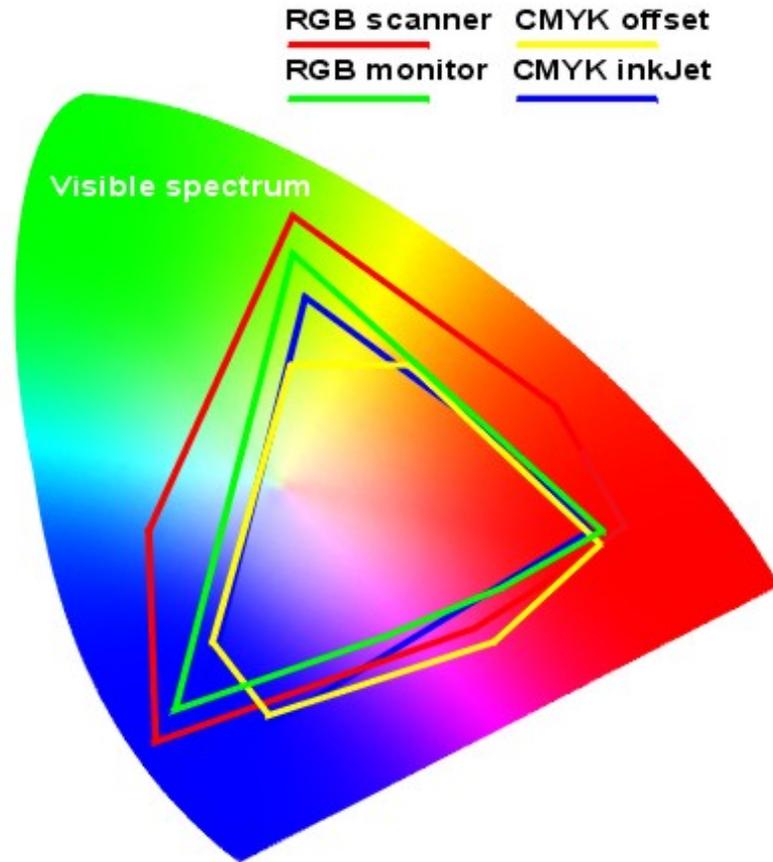
# Example



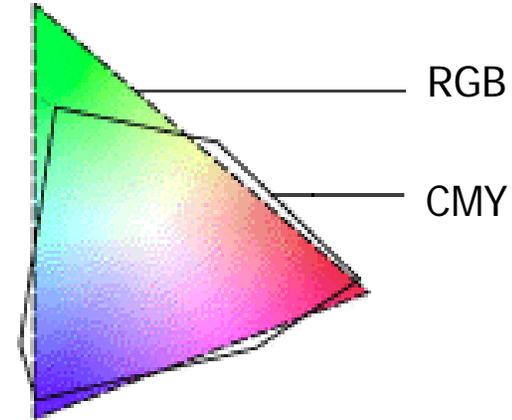
# Example



# Various CMY & RGB Gamuts



Simplified:

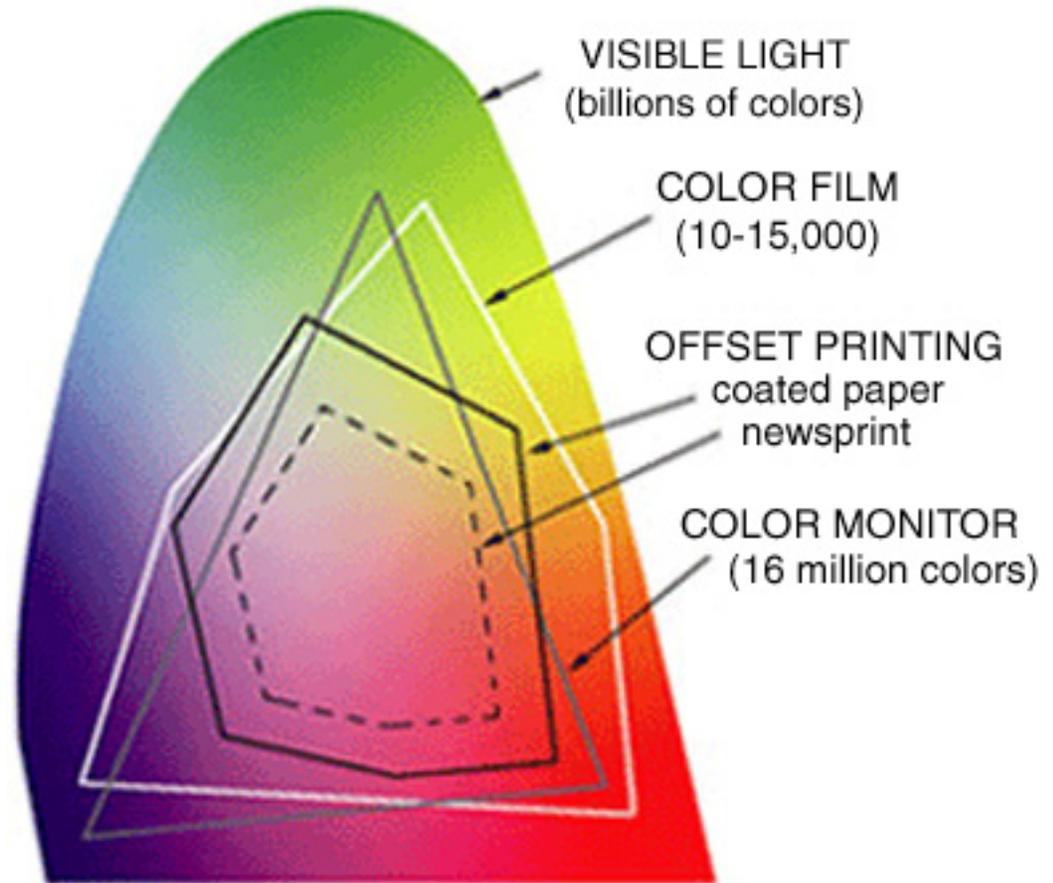


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© [http://www.mlab.nl/GtoDSA/05\\_Techniques/02\\_Colour/Colour\\_Gamut.htm](http://www.mlab.nl/GtoDSA/05_Techniques/02_Colour/Colour_Gamut.htm)

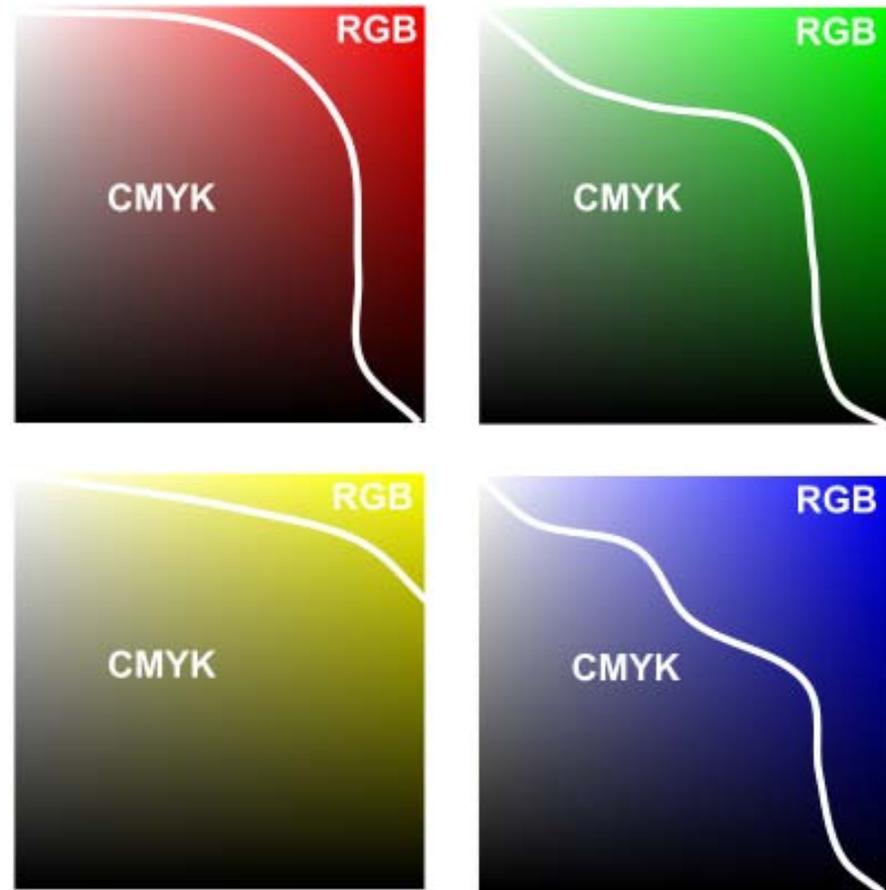
# Printing Color Transfer

Although the color gamuts for different devices overlap, they don't match exactly, so colors available on video monitor may not be printable on a press.



# Printing Color Transfer

When colors are translated from the RGB gamut of the computer monitor to CMYK gamut of process printing inks, the CMYK range does a better job of reproducing some colors than it does with others.



# YIQ Color Model

- **YIQ** is the color model used for color TV in America (NTSC= National Television Systems Committee)
- **Y** is luminance, **I** & **Q** are color (I=red/green,Q=blue/yellow)
  - Note: **Y** is the same as CIE's **Y**
  - Result: backwards compatibility with B/W TV!

- Convert from RGB to YIQ: 
$$\begin{bmatrix} Y \\ I \\ Q \end{bmatrix} = \begin{bmatrix} 0.30 & 0.59 & 0.11 \\ 0.60 & -0.28 & -0.32 \\ 0.21 & -0.52 & 0.31 \end{bmatrix} \begin{bmatrix} R \\ G \\ B \end{bmatrix}$$

- The YIQ model exploits properties of our visual system, which allows to assign different bandwidth for each of the primaries.

# YIQ Bandwidth

Why separates luminance or brightness from color?

- We perceive brightness ranges better than color so we can give it more bandwidth:

*Y*: 4.5 MHz

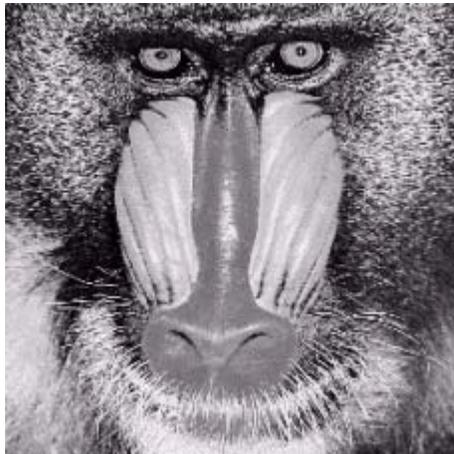
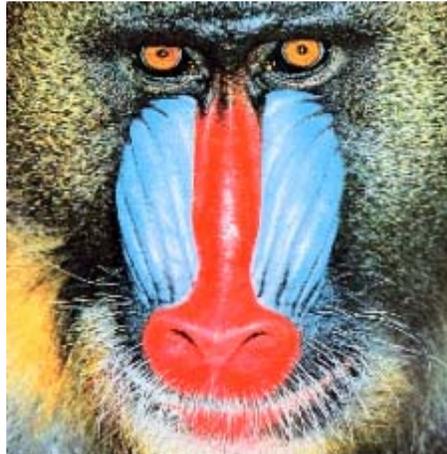
*I*: 1.5 MHz

*Q*: 0.6 MHz

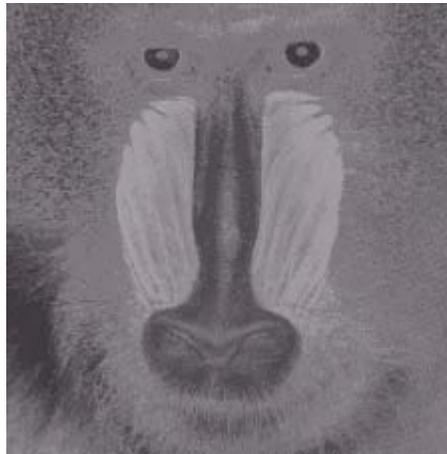
# YUV Color Model

- **YUV** is the color model used for color TV in Europe (PAL), and in video. Also called YCbCr.
- **Y** is luminance as in YIQ.
- **U** and **V** are blue and red (Cb and Cr).
- The YUV uses the same benefits as YIQ, (5.5 MHz for Y, 1.3 for U and V).
- Converting from RGB to YUV:
  - $Y = 0.299R + 0.587G + 0.114B$
  - $U = 0.492(B - Y)$
  - $V = 0.877(R - Y)$

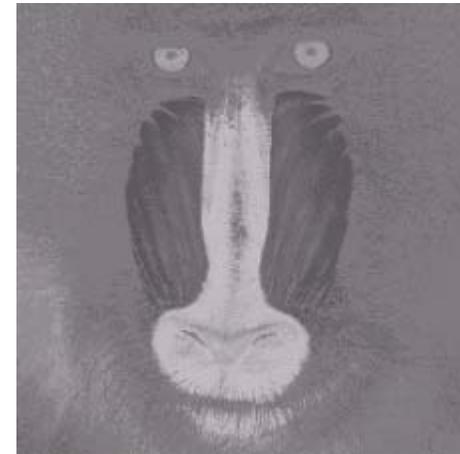
# YUV - Example



Y



U



V

# Tints and Shades

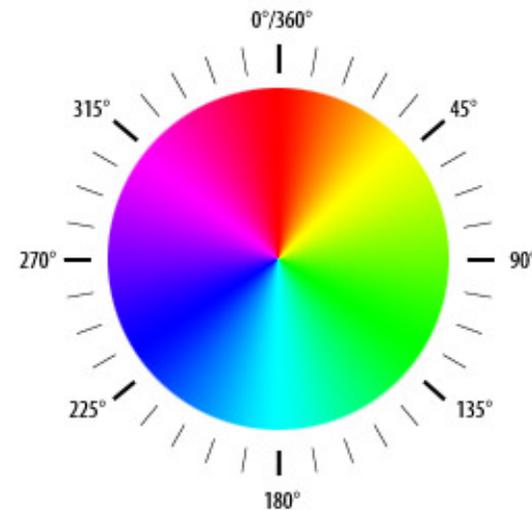
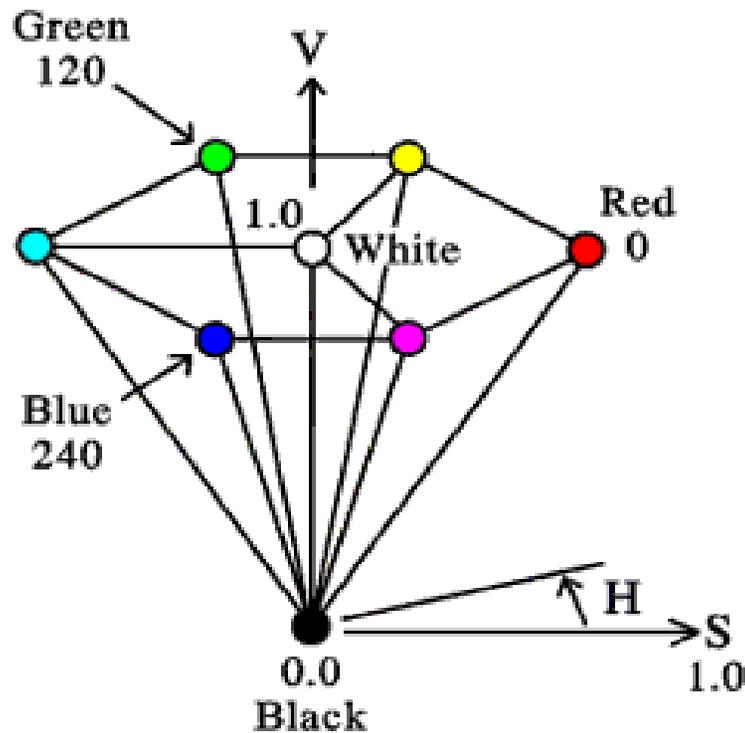
Tint: adding more white to a color

Shade: adding more black to a color

Tints and shades are not inverses! Why? Hint: Saturation...

# HSV Color Space

HSV = Hue Saturation Value  
a.k.a. HSB = Hue Saturation Brightness



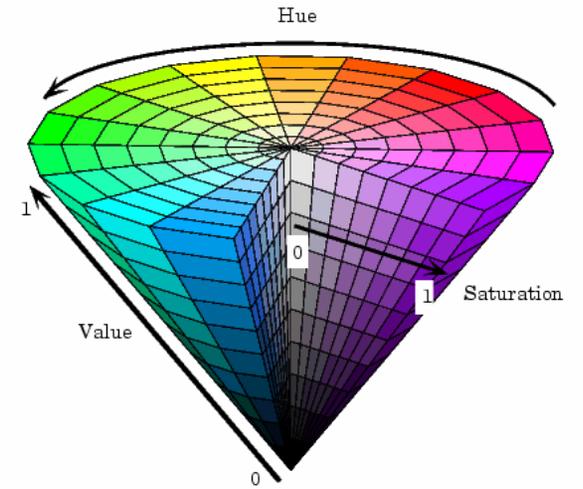
Saturation Scale



Brightness Scale



# HSV



Color selection dialog box showing HSV controls:

Standard Custom

Colors:

Hue: 47 Red: 206  
Sat: 162 Green: 218  
Lum: 154 Blue: 90

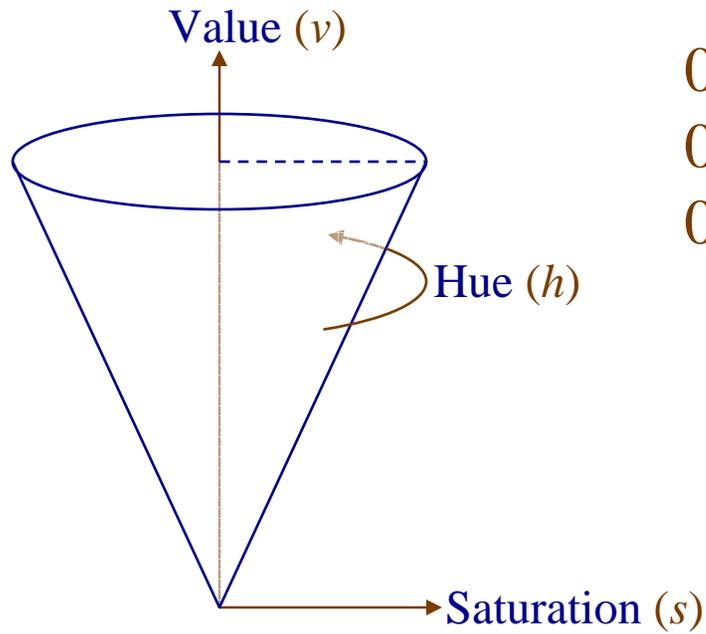
OK  
Cancel  
Preview

New  
Current

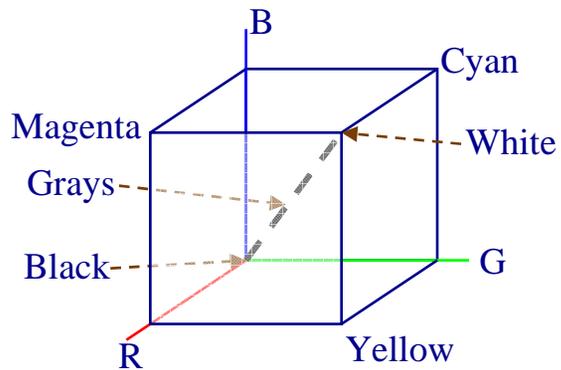
# HSV

- Much more intuitive for specifying colors!
- Hue: the color
- Saturation: the depth of the color
- Value: the brightness of the color
- Results from a non-linear distortion of the RGB cube
- Singularities at pure black and pure white

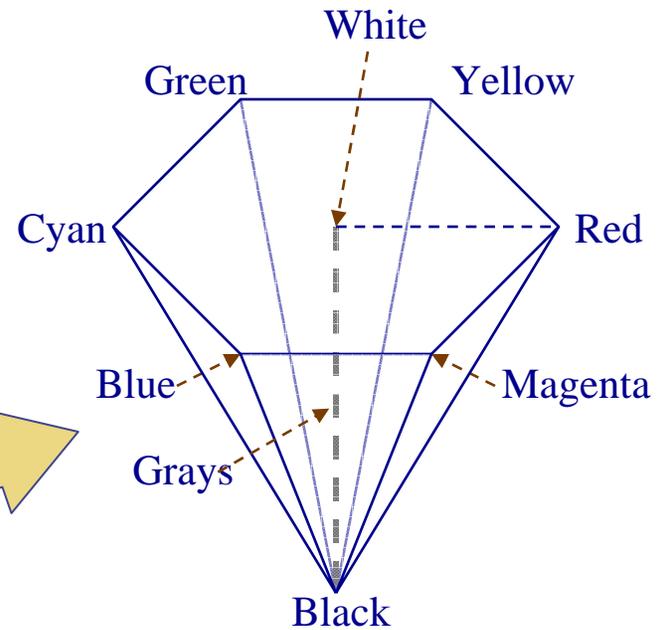
# HSV



$$0 \leq s \leq 1$$
$$0 \leq v \leq 1$$
$$0 \leq h \leq 360$$

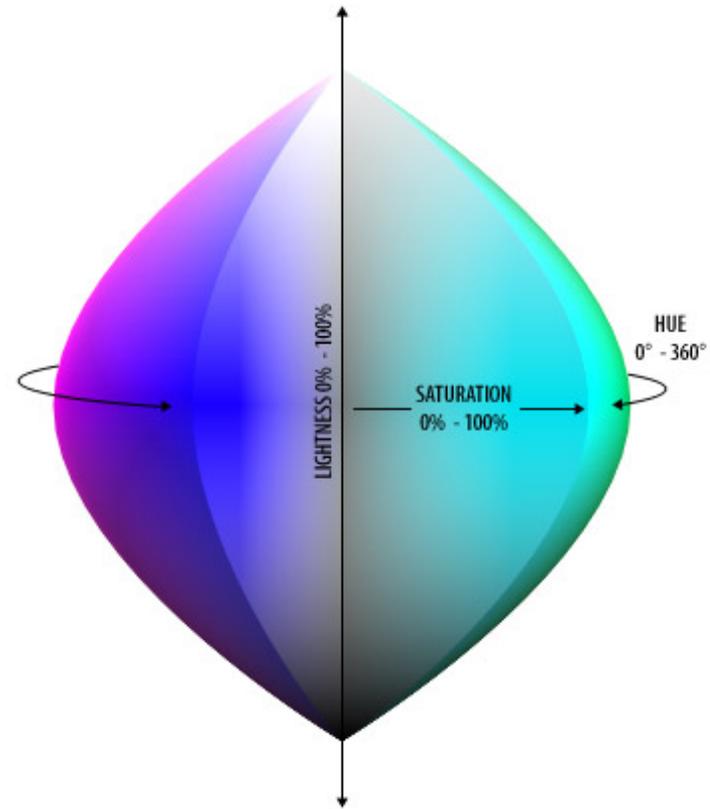
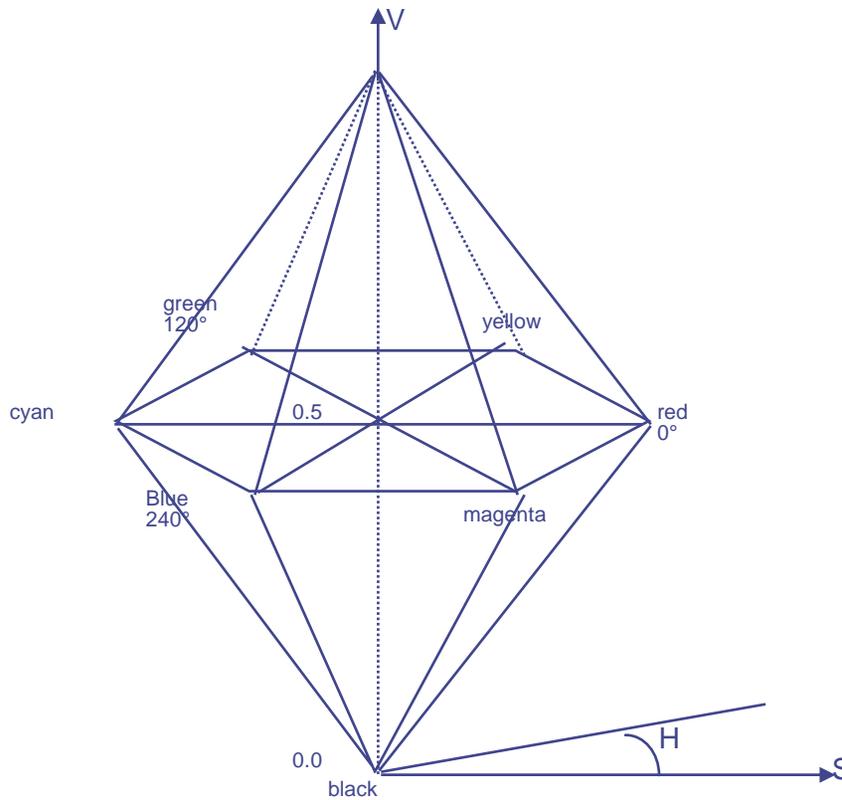


*Non-linear distortion*



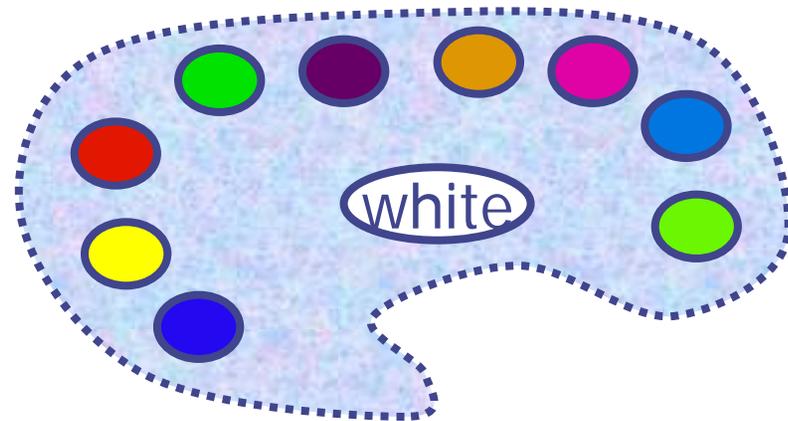
# HLS Color Space

HLS = Hue Lightness Saturation



# The Artist Point of View

- **Hue** - The color we see (red, green, purple)
- **Saturation** - How far is the color from gray (pink is less saturated than red, sky blue is less saturated than royal blue)
- **Brightness/Lightness (Luminance)** - How bright is the color



# Munsell Color System

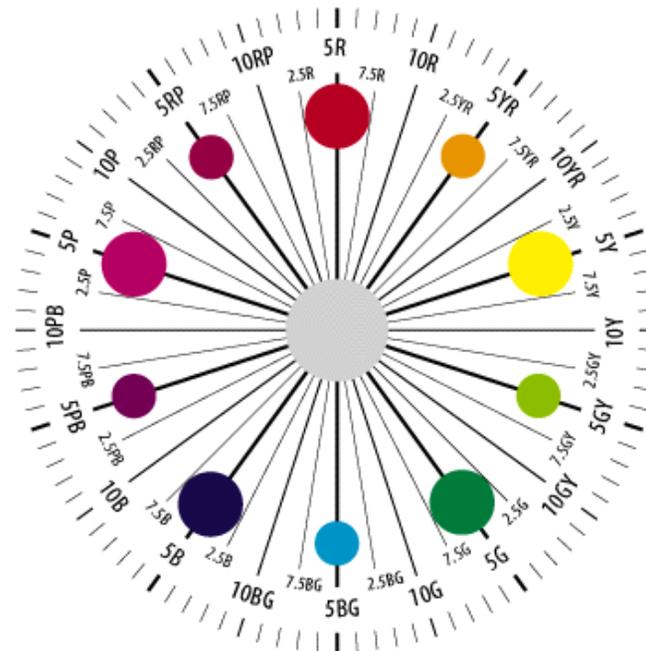
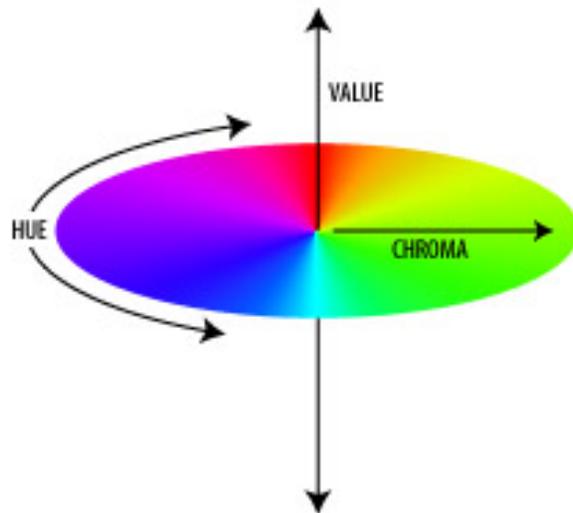
Equal perceptual steps in Hue Saturation Value.

Hue: R, YR, Y, GY, G, BG, B, PB, P, RP  
(each subdivided into 10)

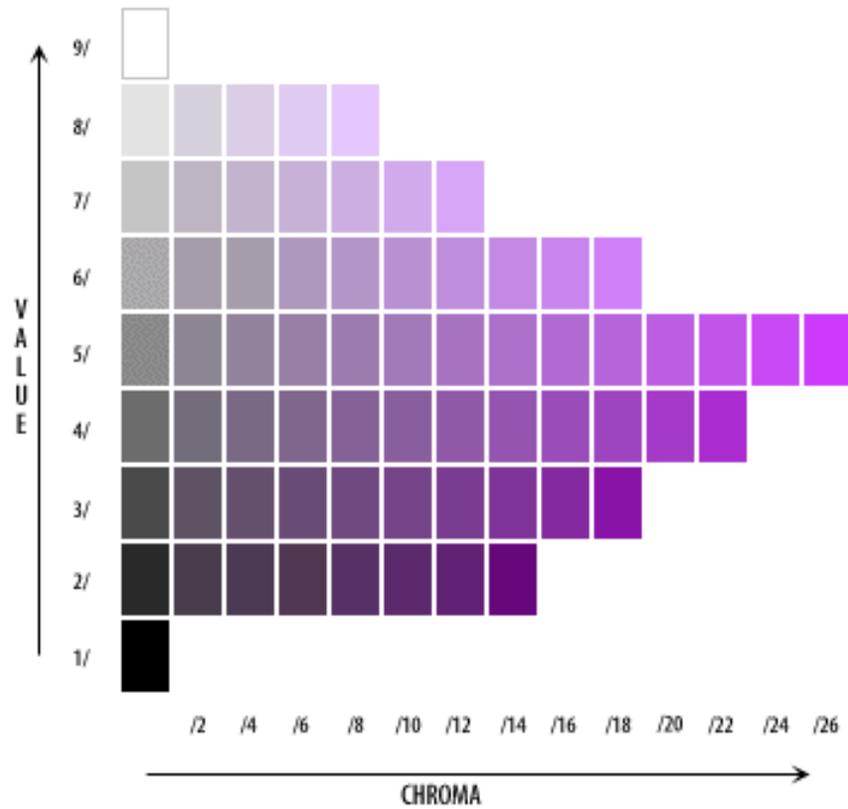
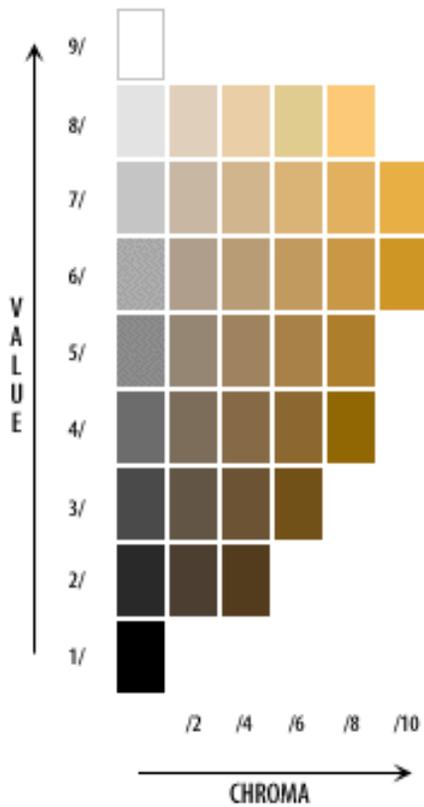
Value: 0 ... 10 (dark ... pure white)

Chroma: 0 ... 20 (neutral ... saturated)

Example:  
5YR 8/4



# Munsell Book of Colors



# Munsell Book of Colors



# Color-Encoding

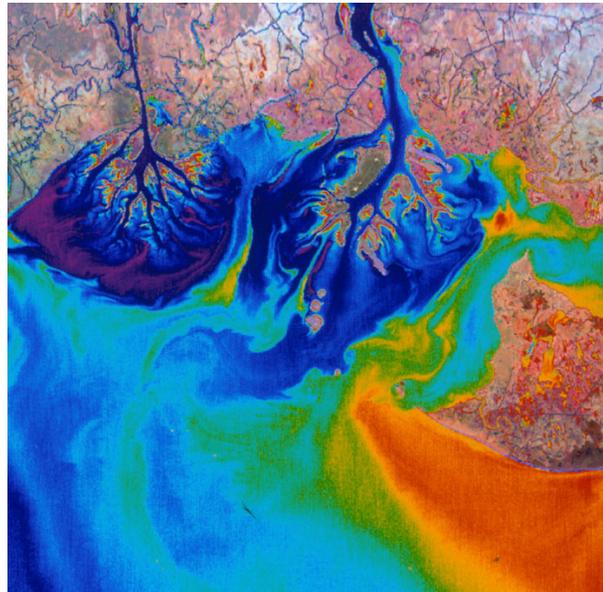
# Pseudo Color

Color can make information visualization more interesting, but be careful using color to convey information

Specific color meanings: **useful, but keep them limited**

Color scales are harder to interpret than intensity scales

*(Heat scale is one of the few that partially works)*



Atchafalya Bay Thermal Pseudocolor Image

<http://asapdata.arc.nasa.gov>

# Color Image Processing

Pick a color space that makes sense for your application

To manipulate intensity without changing chromaticity (or to manipulate chromaticity without affecting intensity), use an intensity-chromaticity based model

For perceptual linearity (interpolation, etc.) use CIE *Luv* or CIE *Lab* (or similar) color space

For user interaction, try *HSV* or something similar

Point: *Don't just think that RGB is the only way to manipulate color*

# Color-Reduction

Many color-encoding schemes use some finite number of colors from a larger palette

Example: 8-bit color uses a 256-element look-up table (LUT) to map pixel values (indices) to 24-bit color values

Problem: how to convert 24-bit image to 8-bit pseudo-color

Answer: *Color Quantization*

# Color Quantization

Common color resolution for high quality images is 256 levels for each **Red**, **Green**, **Blue** channels, or  $256^3 = 16777216$  colors.

How can an image be displayed with fewer colors than it contains?

Select a subset of colors (the colormap or pallet) and map the rest of the colors to them.

With e.g. 8 bits per pixel and color look up table we can display at most 256 distinct colors at a time.

To do that we need to choose an appropriate set of representative colors and map the image into these colors

# Color Quantization



2 colors



4 colors



16 colors



256 colors

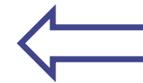
# Quantization Phases

Sample the original image for color statistics

Select color map based on those statistics

Map the colors to their representative in the color map

Redraw the image, quantizing each pixel



# Naive Color Quantization (I)

Retaining the 16 most  
popular RGB colors.



The reds are not that popular  
(but needed)



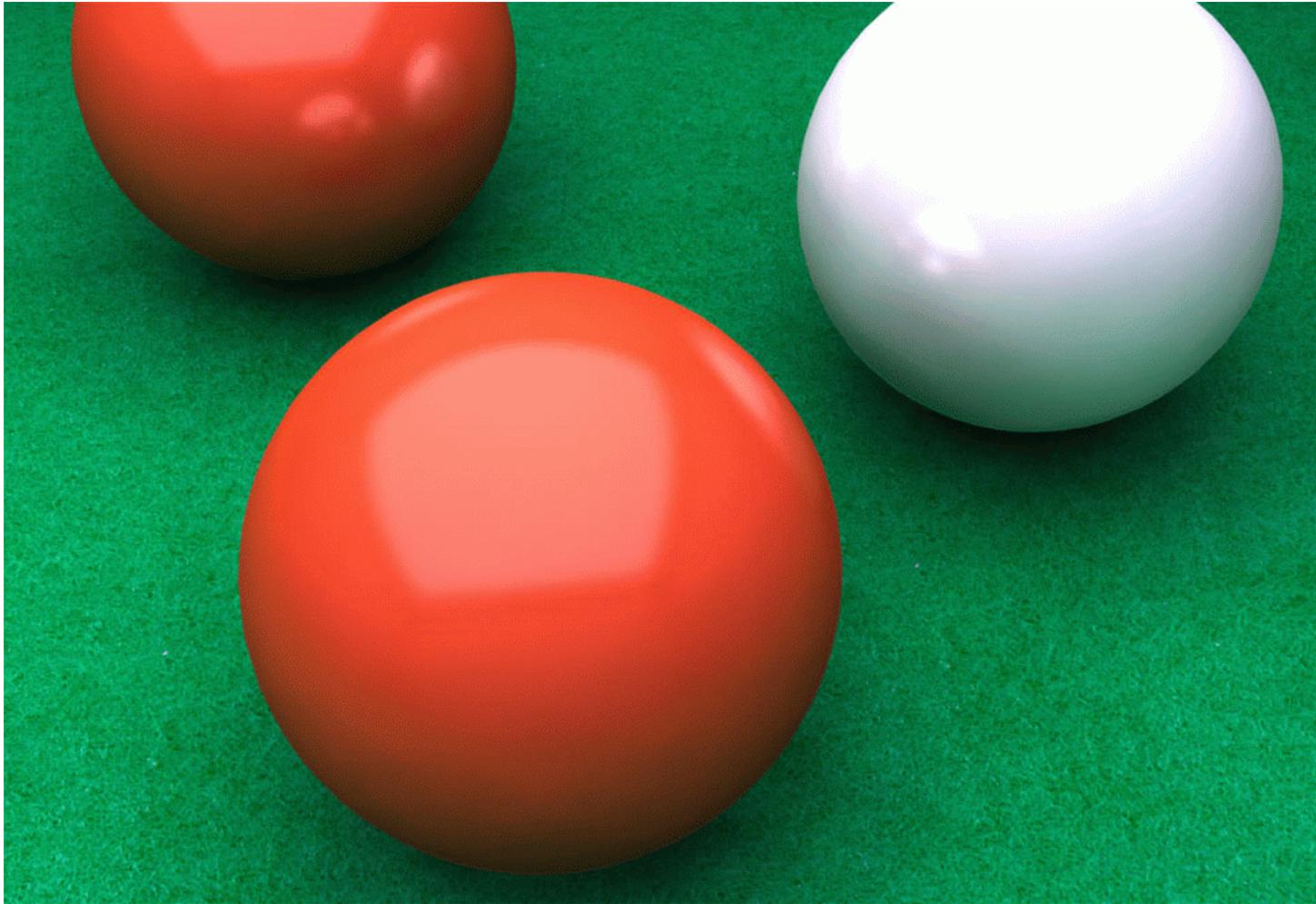
## Naive Color Quantization (II)

24 bit to 8 bit:

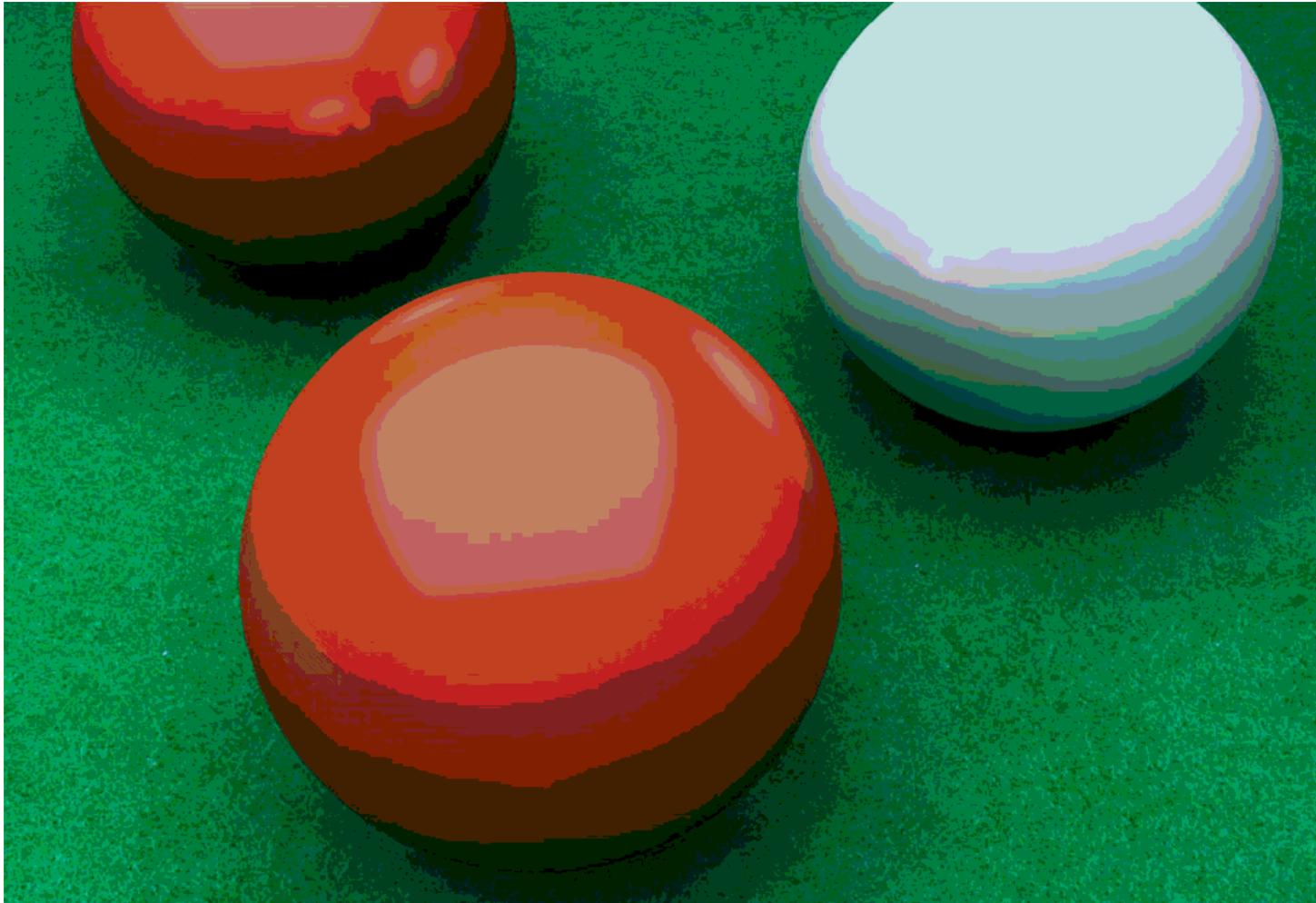
Retaining 3-3-2 most significant bits of the R,G and B components.



3-3-2



3-3-2



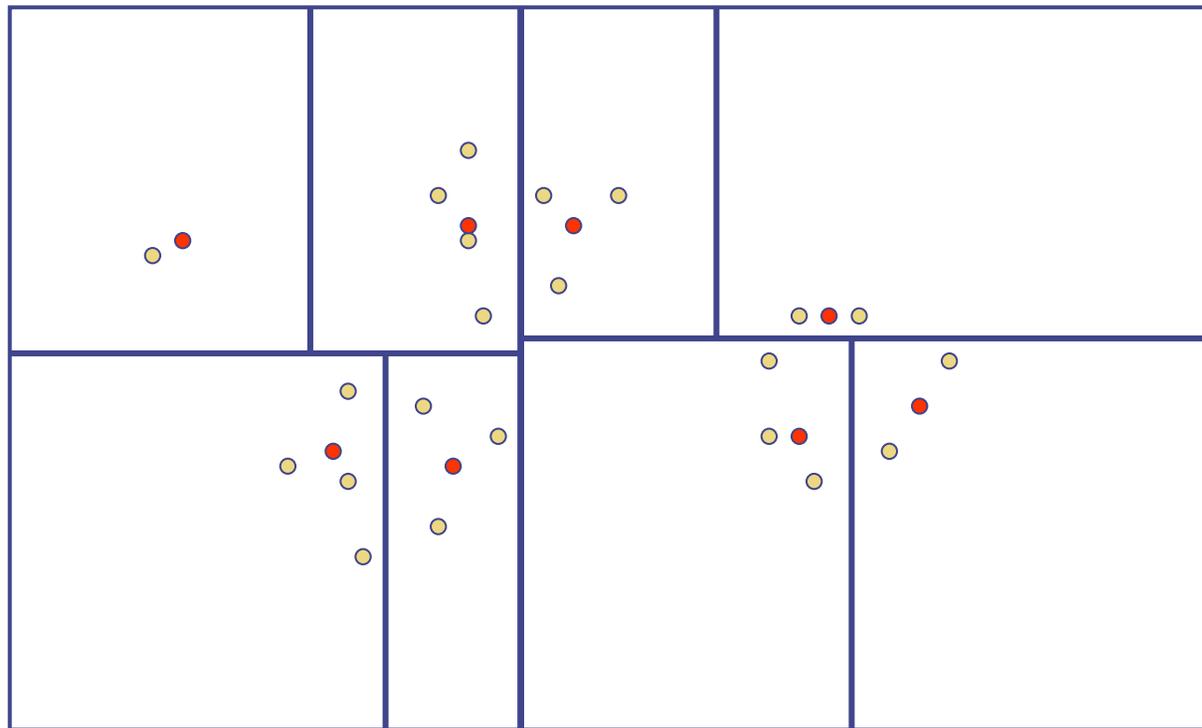
3-3-2



3-3-2



# Median Cut



# Original Image



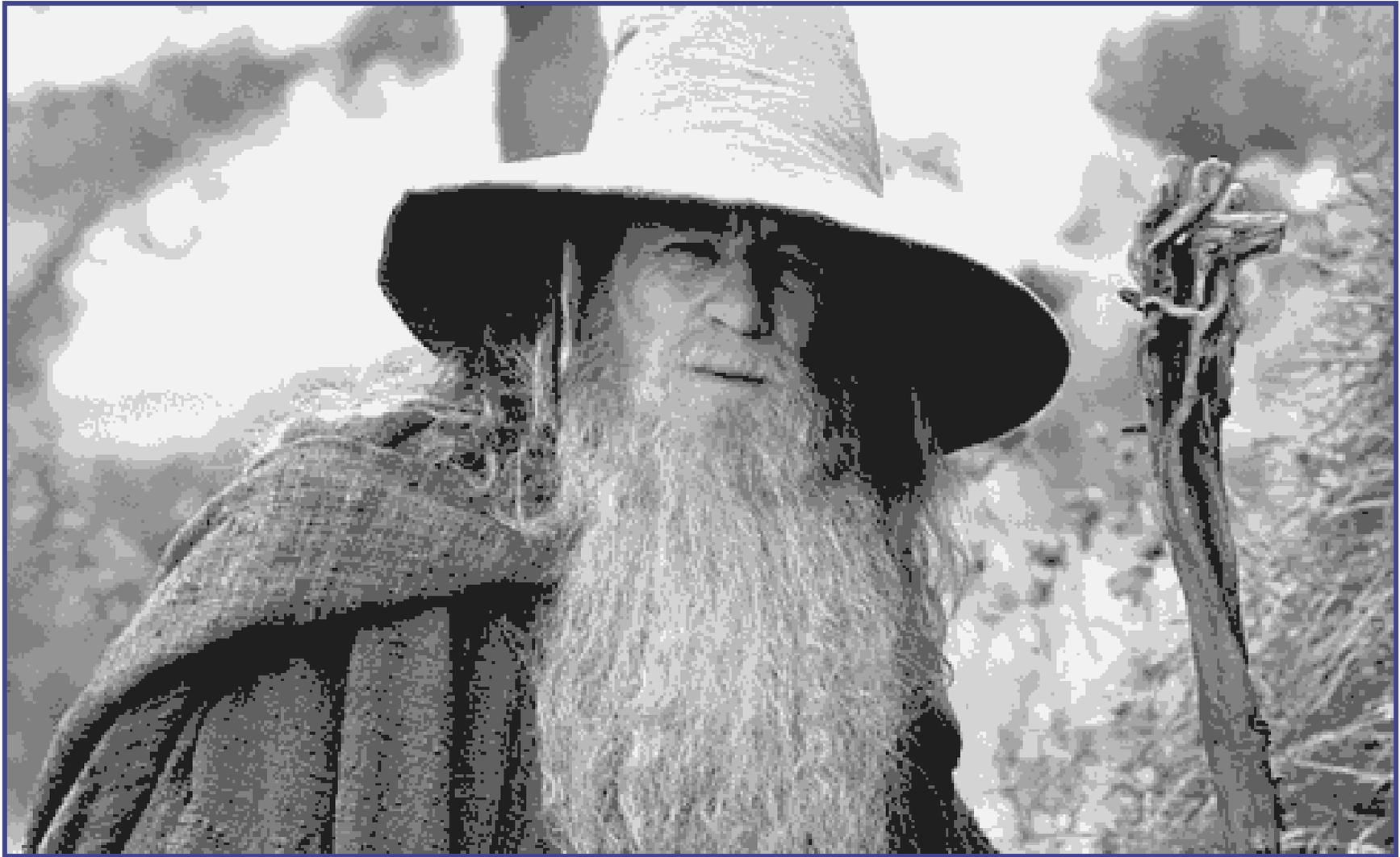
# Threshholding



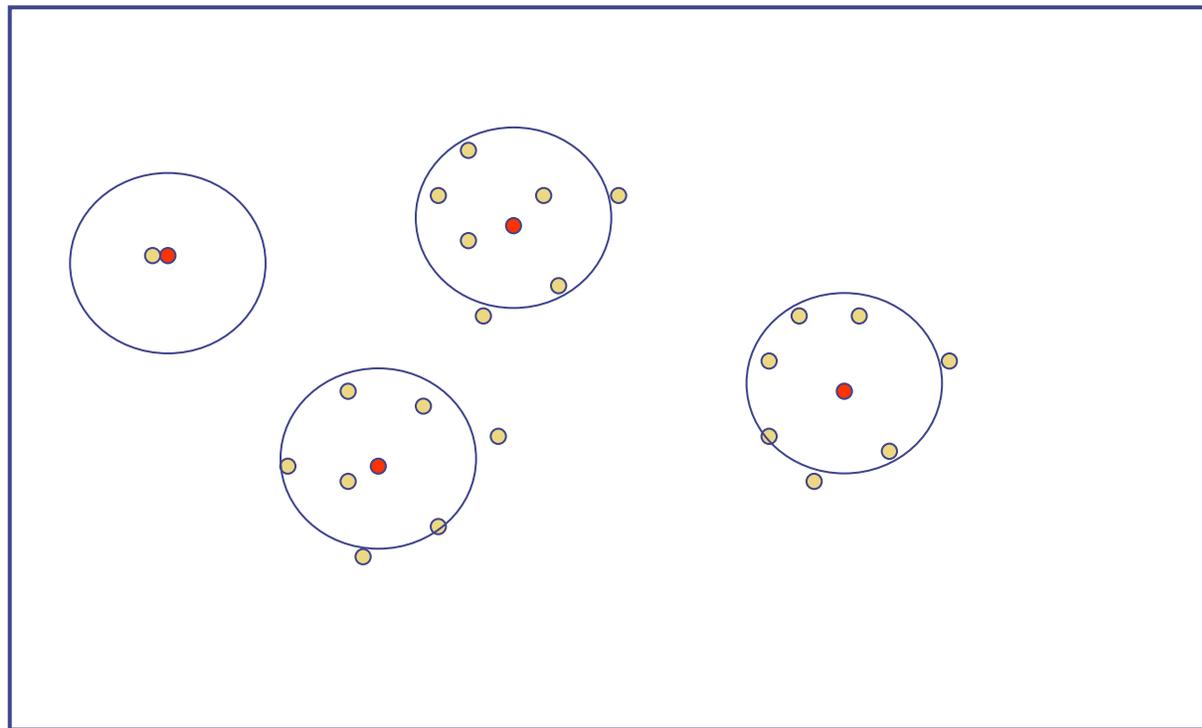
# Median Cut (4 Gray levels)



# Median Cut (8 Gray levels)



# A Better Solution: $k$ -Means



24 bit



8 bit



4 bit



# Resources

Textbook:

Kenneth R. Castleman, Digital Image Processing, Chapter 15, 21, 22