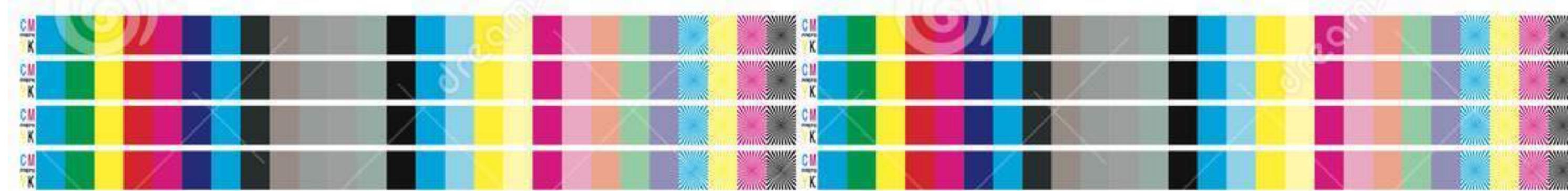




# CPSC 425: Computer Vision



## Lecture 21: Color

( unless otherwise stated slides are taken or adopted from **Bob Woodham, Jim Little and Fred Tung** )

# Menu for Today

## Topics:

- Colour, **Trichromacy**
- **Colour Matching** Experiments
- **Colour Spaces**
- **Final** examples

## Readings:

- **Today's** Lecture: Szeliski 2.3.2, Forsyth & Ponce 3.1-3.3

## Reminders:

- **Assignment 6** due Dec 7th
- **Final** is Dec 14th (**2hrs**, closed book, no calculators)
- Today is the **last lecture!** No lectures next week

# Final Example Questions + Solutions

UBC CPSC 425 101 2023W1 Compute X

2023W1

Monday [redacted]

Wednesday [redacted]

Friday [redacted]

**Assssignments**

Assignment due dates will be **Thursdays at 23:59**. Links for assignment hand-in will be posted here with the following schedule:

- Assignment 1:** [Image Filtering and Hybrid Images, Sep 28](#)
- Assignment 2:** [Scaled Representations, Face Detection and Image Blending, Oct 12](#)
- Assignment 3:** [Texture Synthesis, Oct 26](#)
- Assignment 4:** [RANSAC and Panorama Stitching, Nov 9](#)
- Assignment 5:** [Scene Recognition with Bag of Words, Nov 23](#)
- Assignment 6:** Deep Learning, Dec 7

**Midterm prep**

[Midterm preparation problems and solutions \(zip\) ↓](#)

Midterm practice [past questions ↓](#) and [solutions ↓](#)

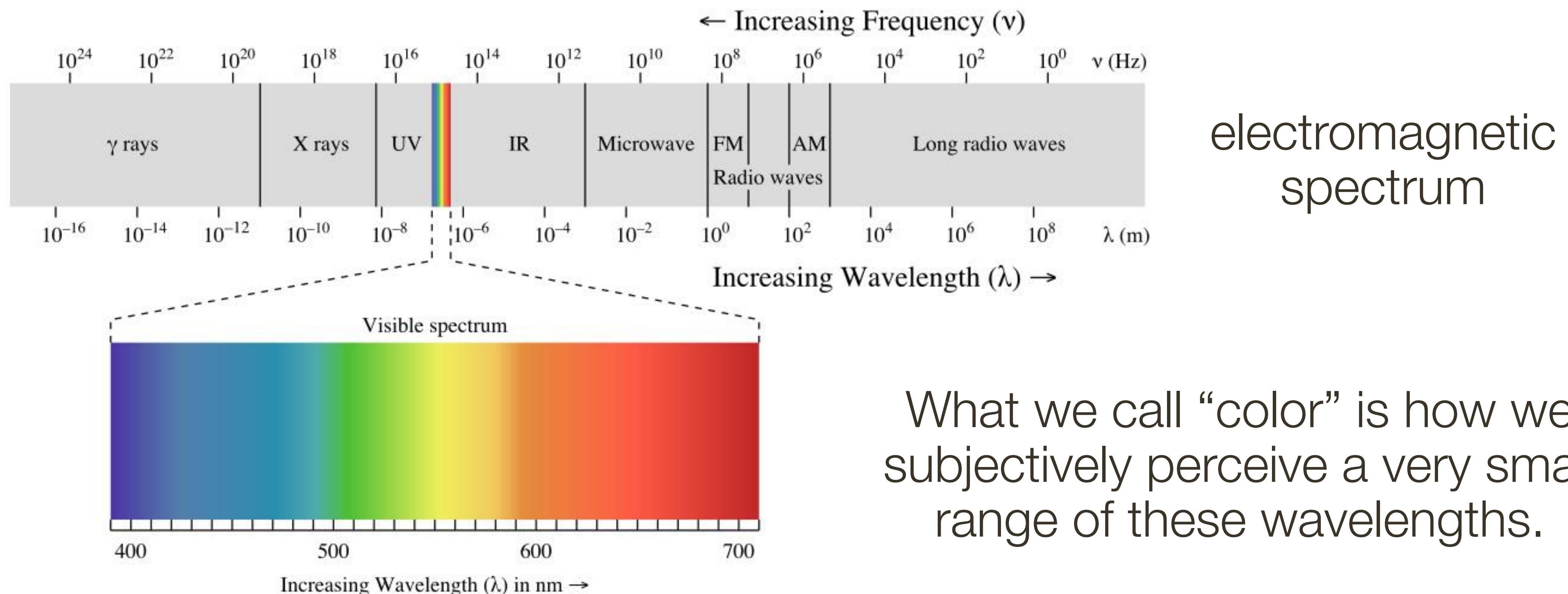
**Final prep**

[Final preparation problems and solutions \(zip\) ↓](#)

Scroll down on homepage on Canvas

# Recall: Color is an Artifact of Human Perception

“Color” is **not** an objective physical property of light (electromagnetic radiation). Instead, light is characterized by its wavelength.



# Spectral Power Distribution

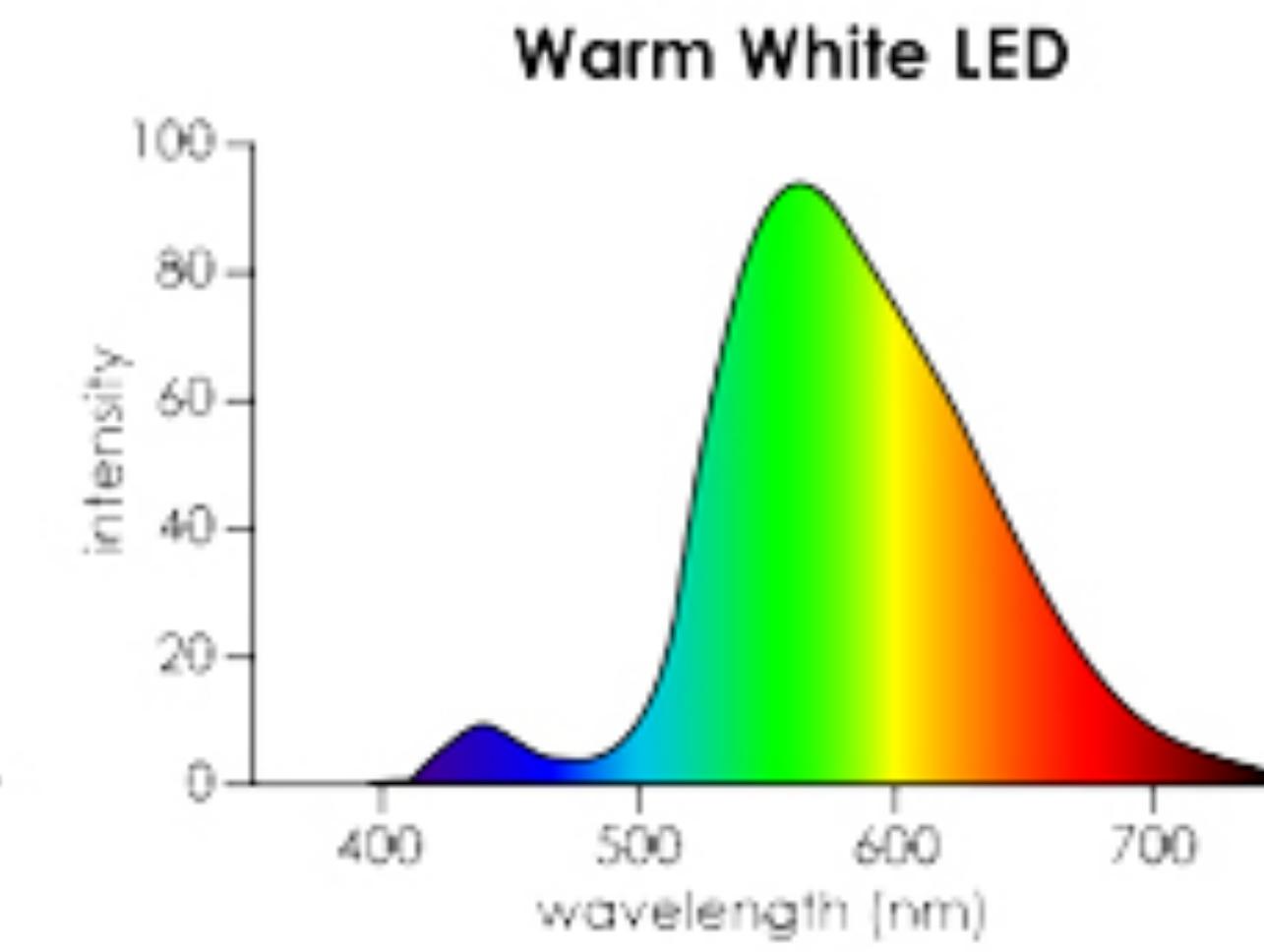
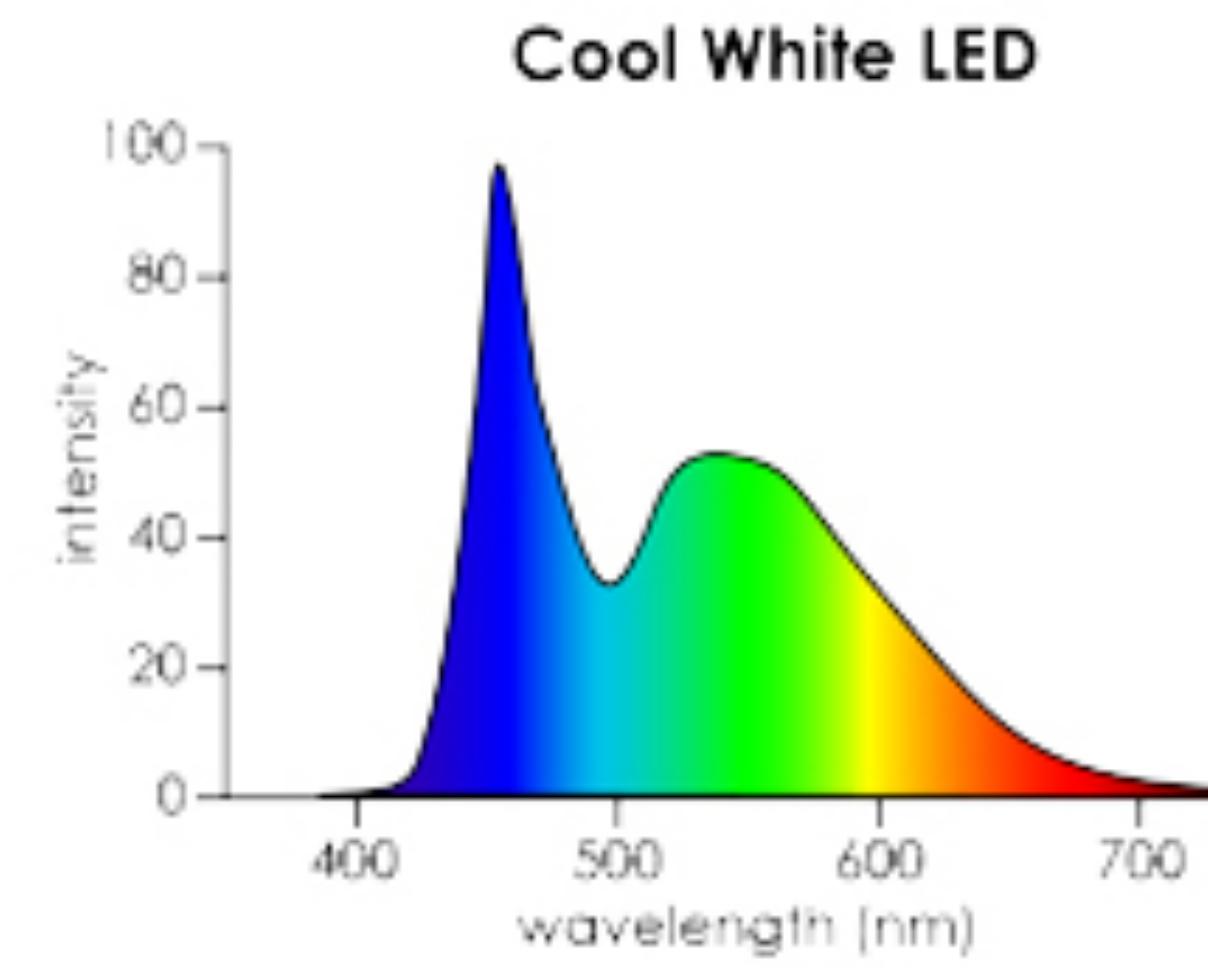
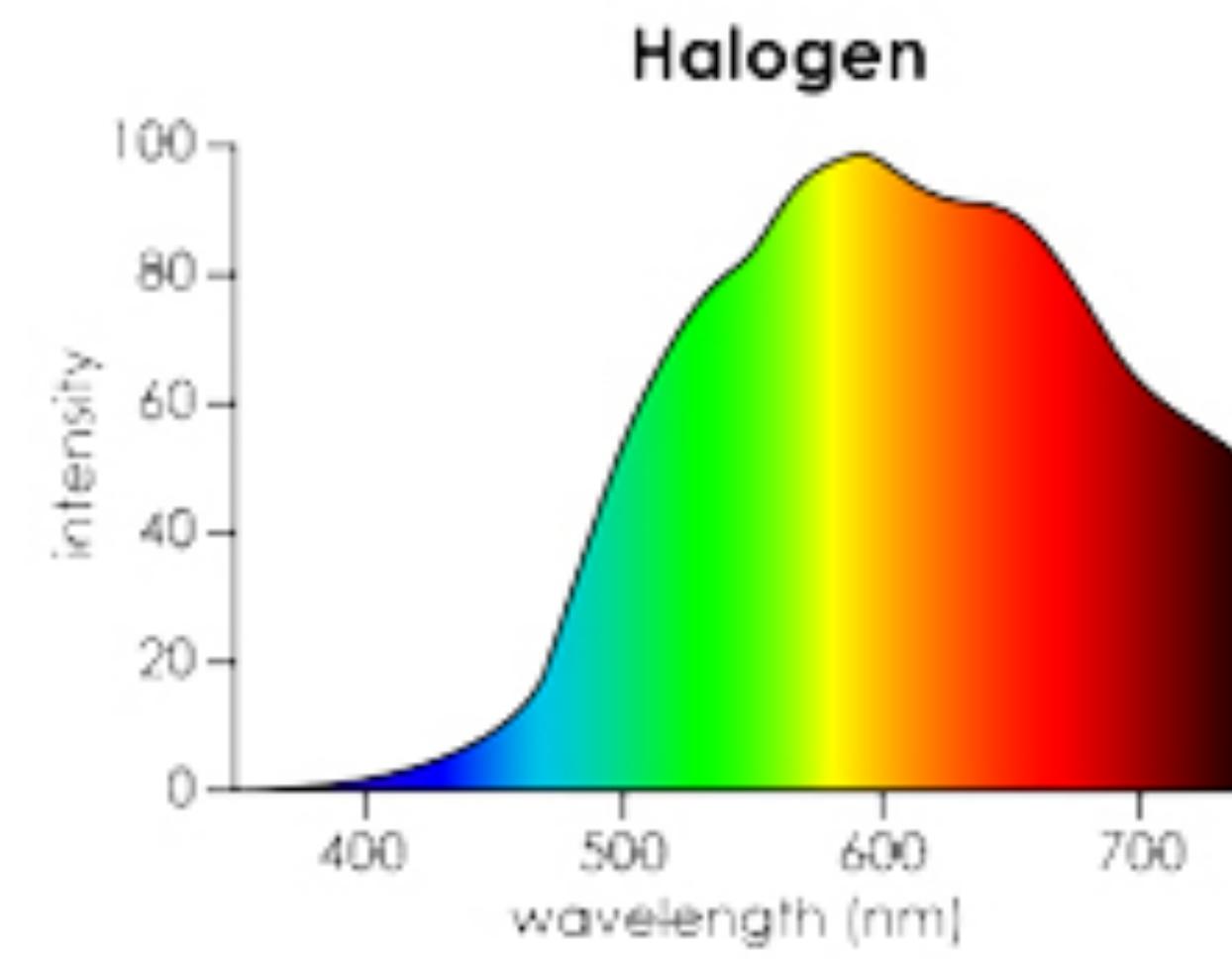
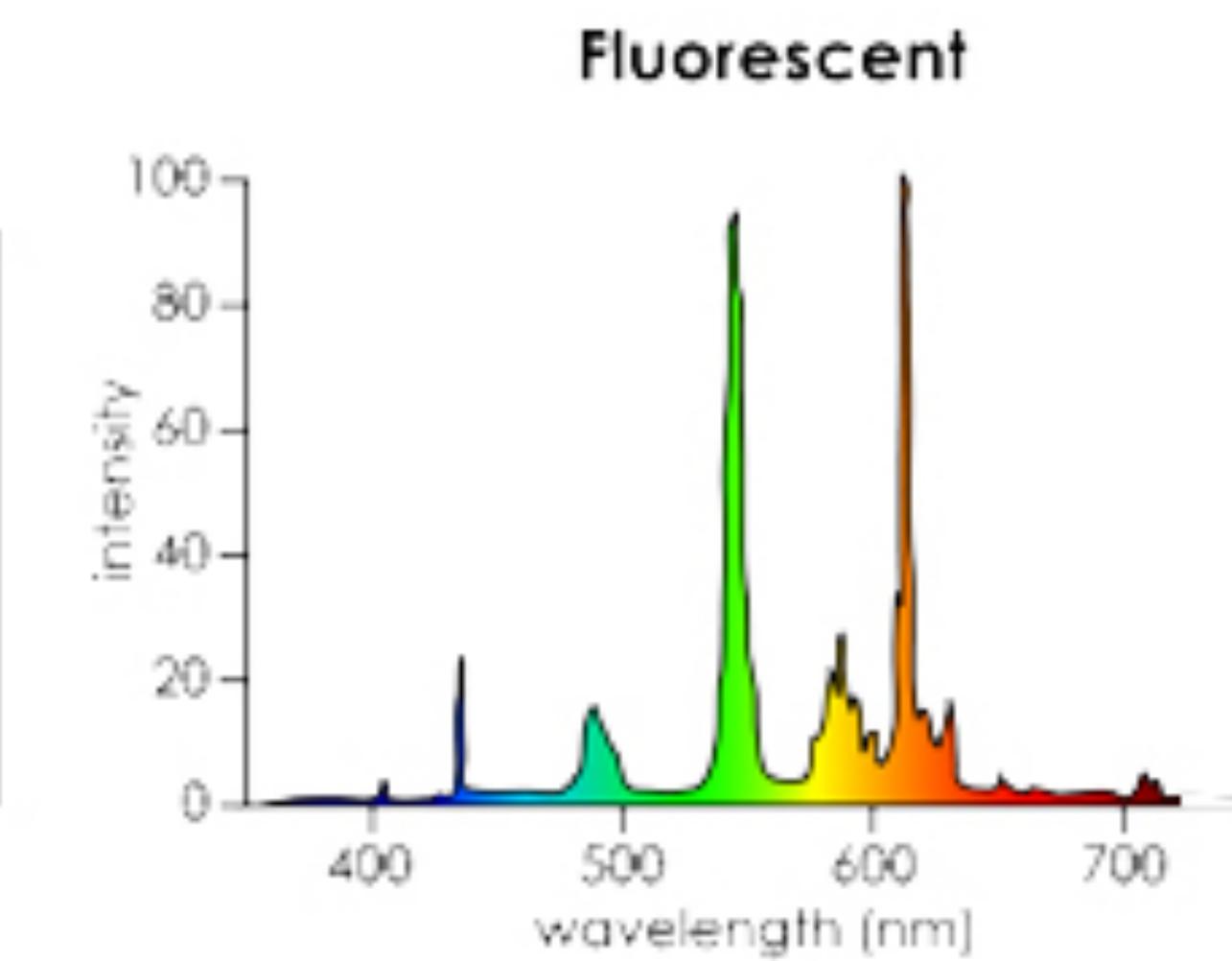
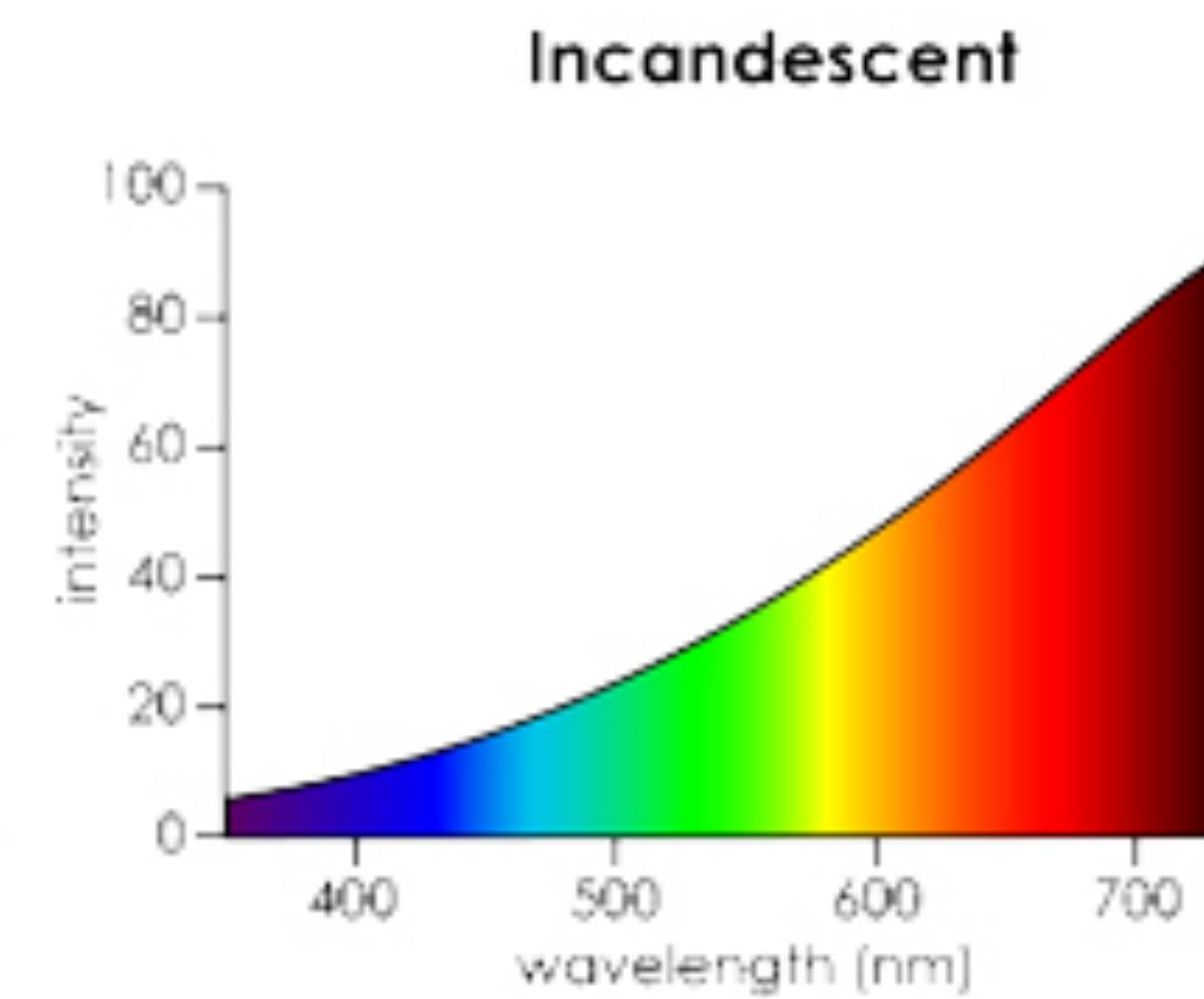
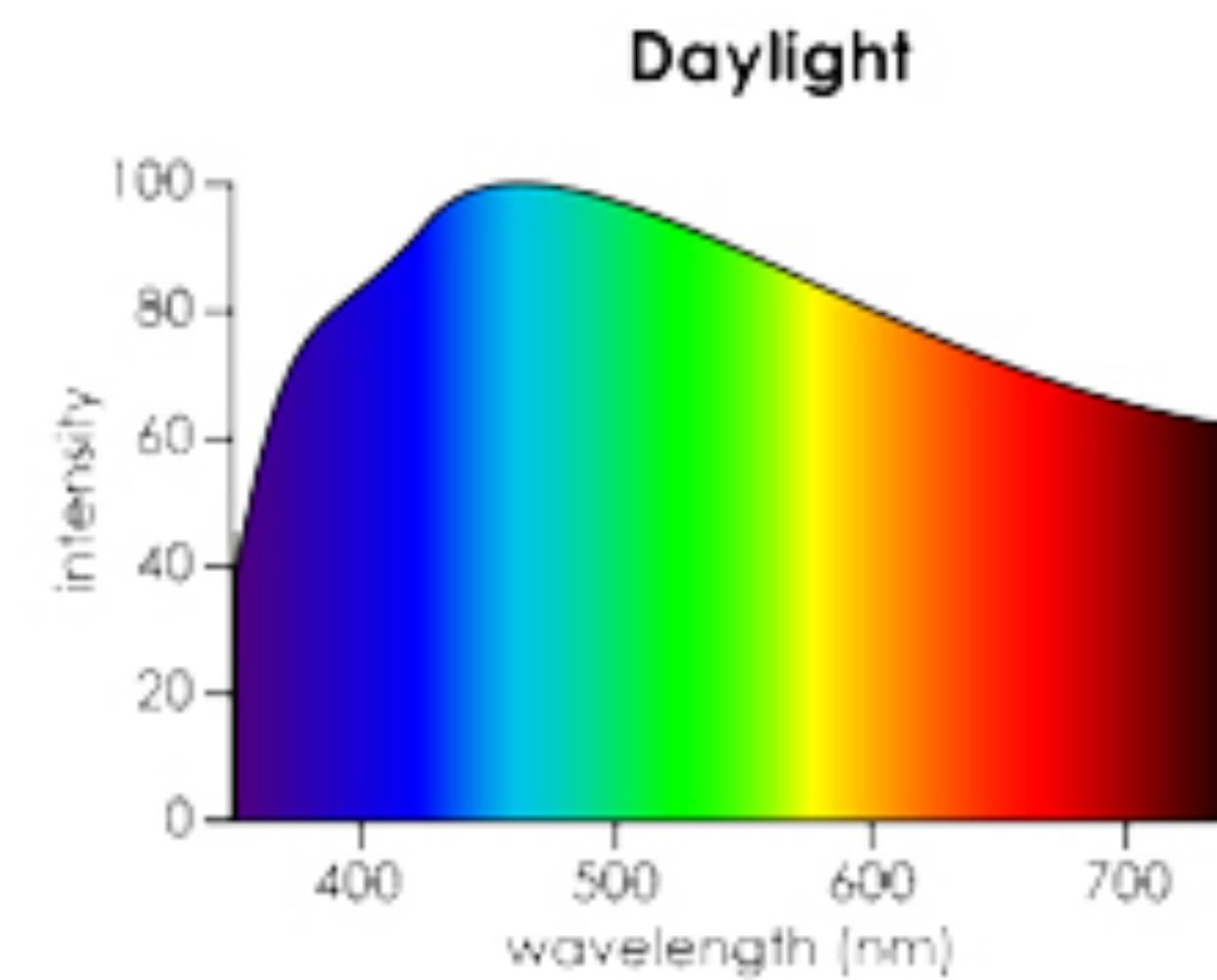
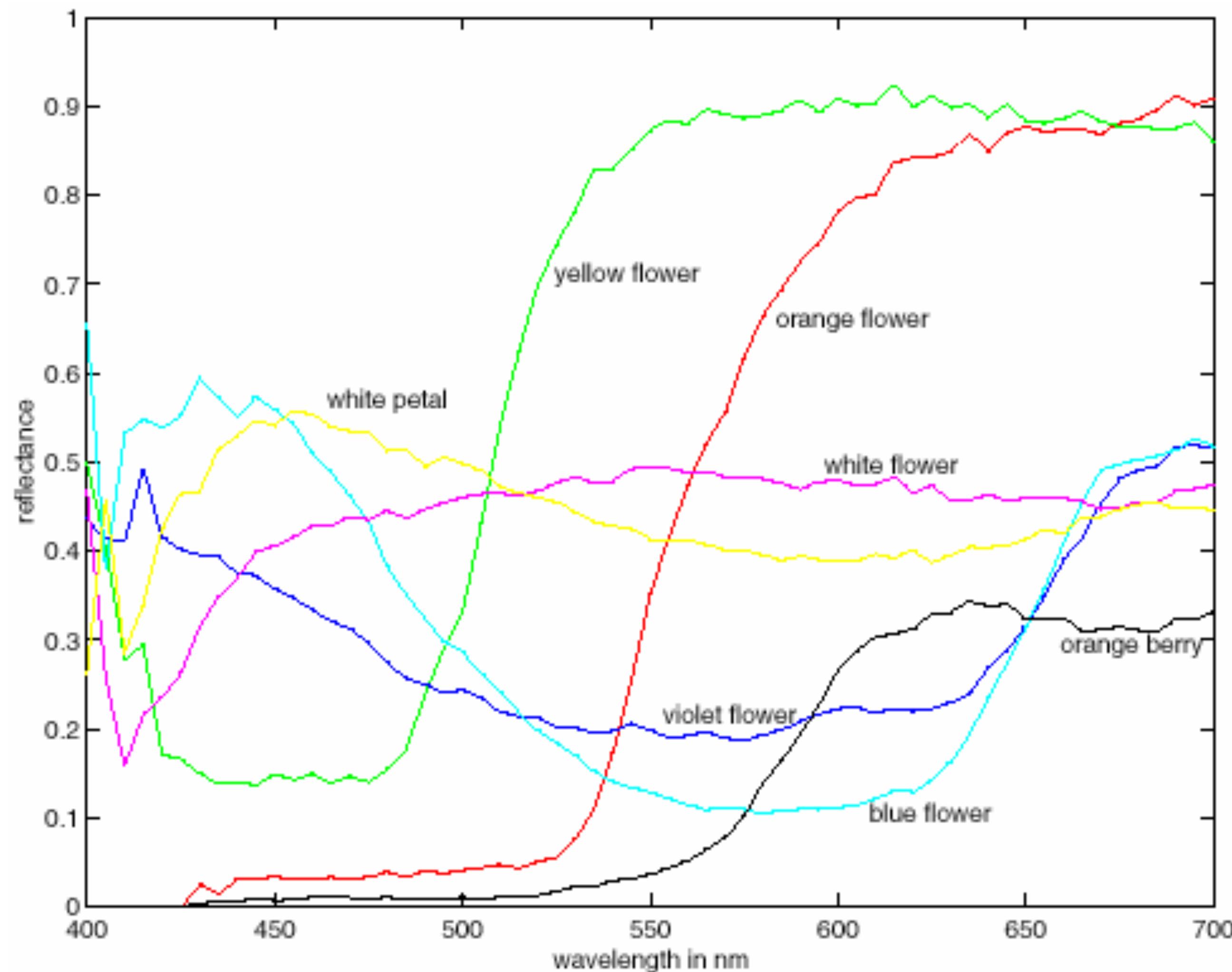


Figure credit:  **admesy**  
ADVANCED MEASUREMENT SYSTEMS

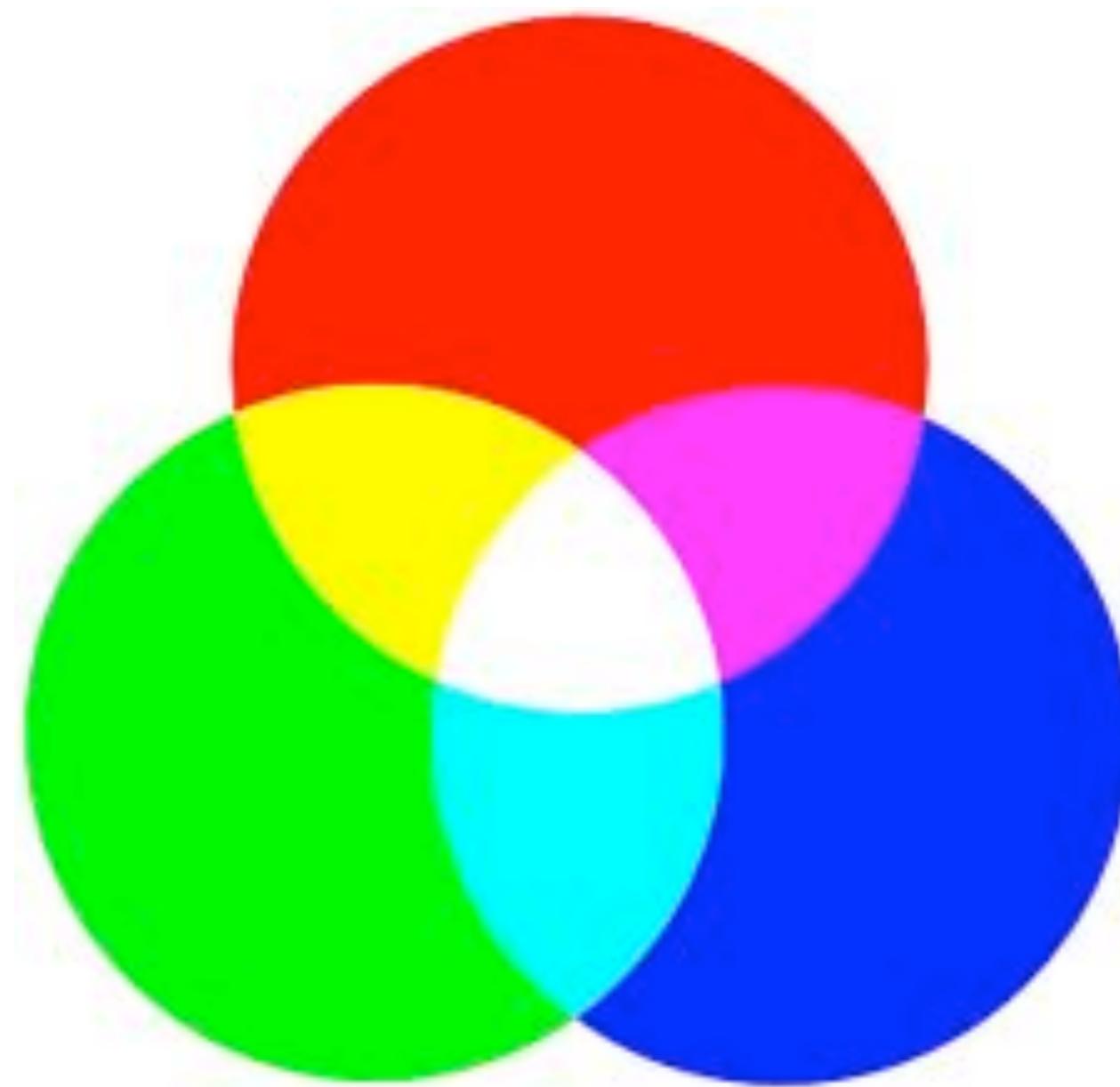
# Spectral Albedo of Natural Surfaces



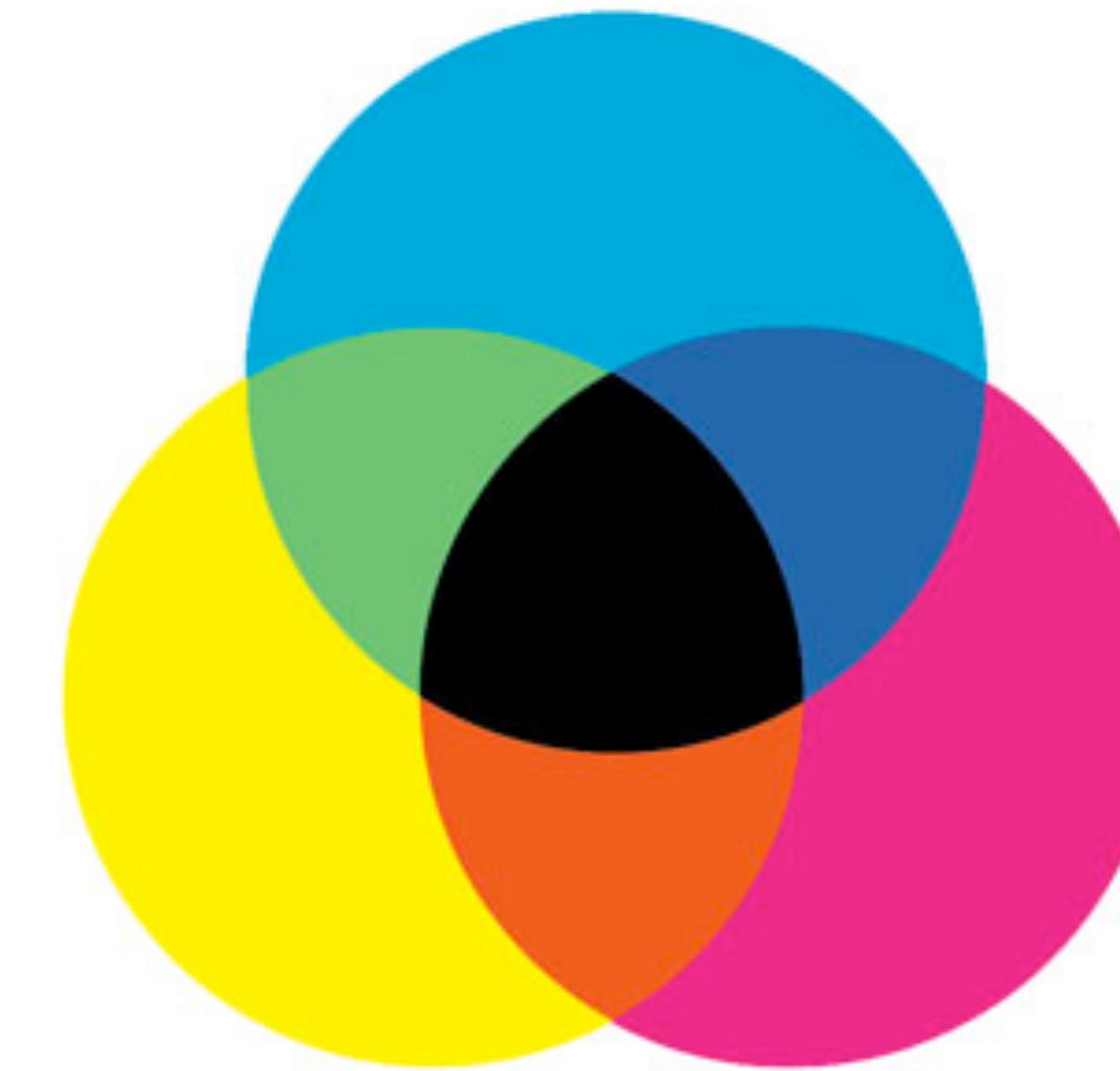
Forsyth & Ponce (2nd ed.) Figure 3.6

# Additive and “Subtractive” Colour

- Why are monitors RGB and printers CMYK?



Additive Colour:  
Coloured lights, LCD  
monitors



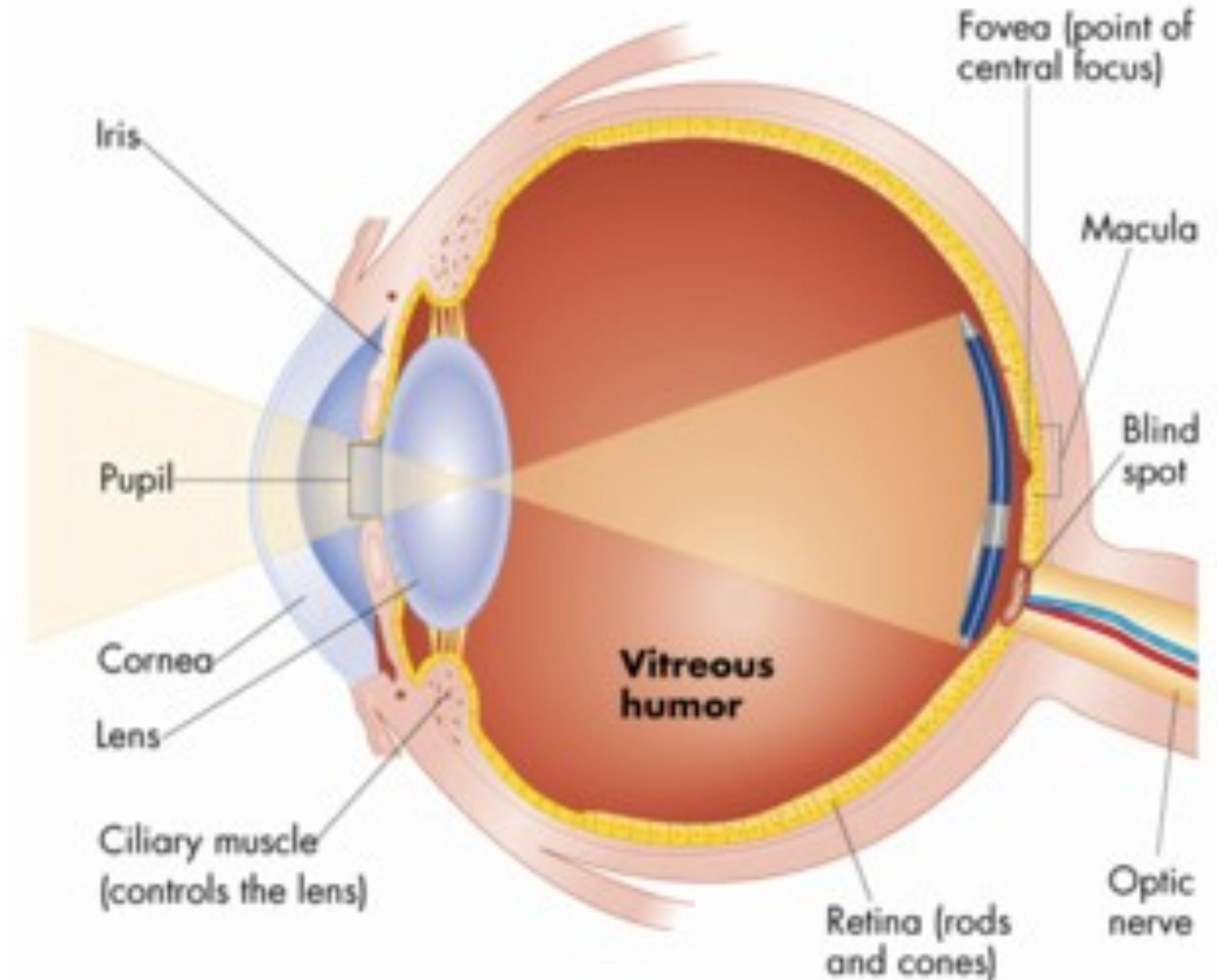
Subtractive Colour\*:  
Filters, printers, object +  
illumination spectra

(\*multiply spectra)

# Sensors



CMOS (or CCD)



Retina

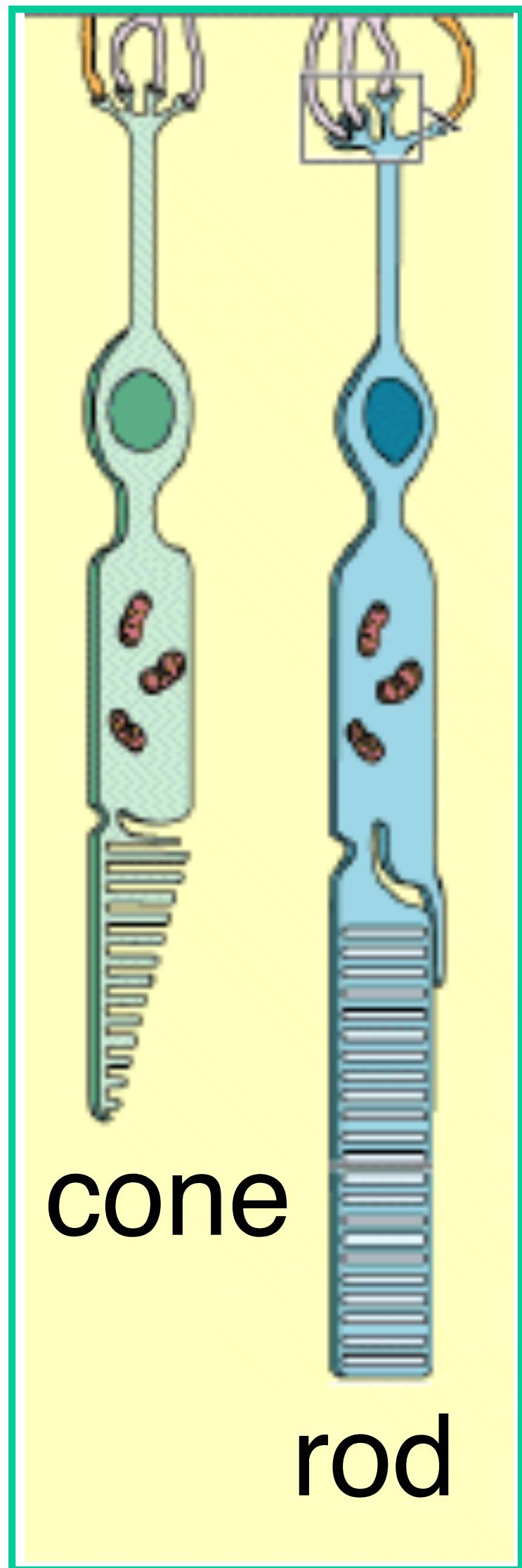
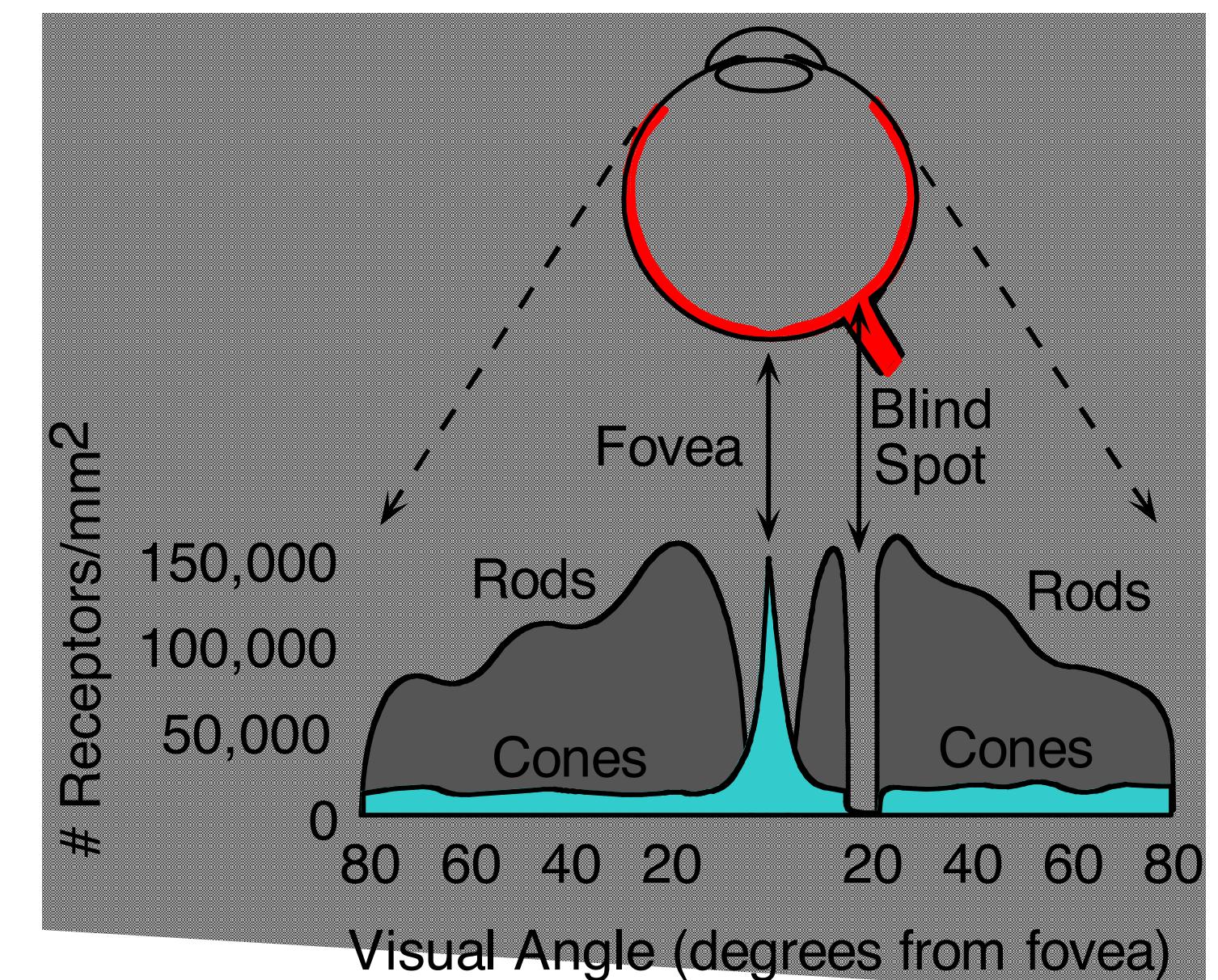
# Two-types of Light Sensitive Receptors

## Rods

75-150 million rod-shaped receptors  
**not** involved in color vision, gray-scale vision only  
operate at night  
highly sensitive, can respond to a single photon  
yield relatively poor spatial detail

## Cones

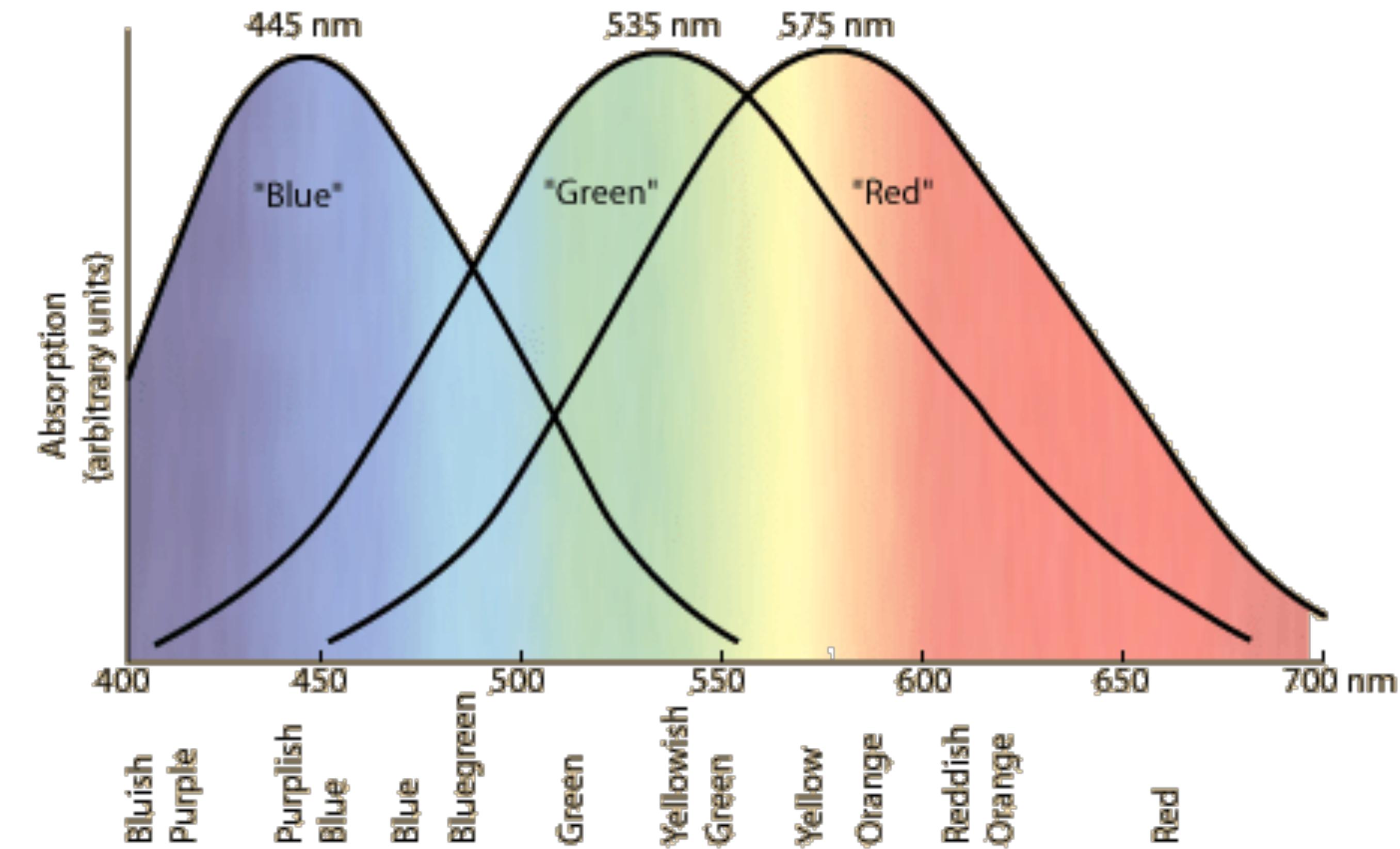
6-7 million cone-shaped receptors  
color vision  
operate in high light  
less sensitive  
yield higher resolution



# Human Cone Sensitivity



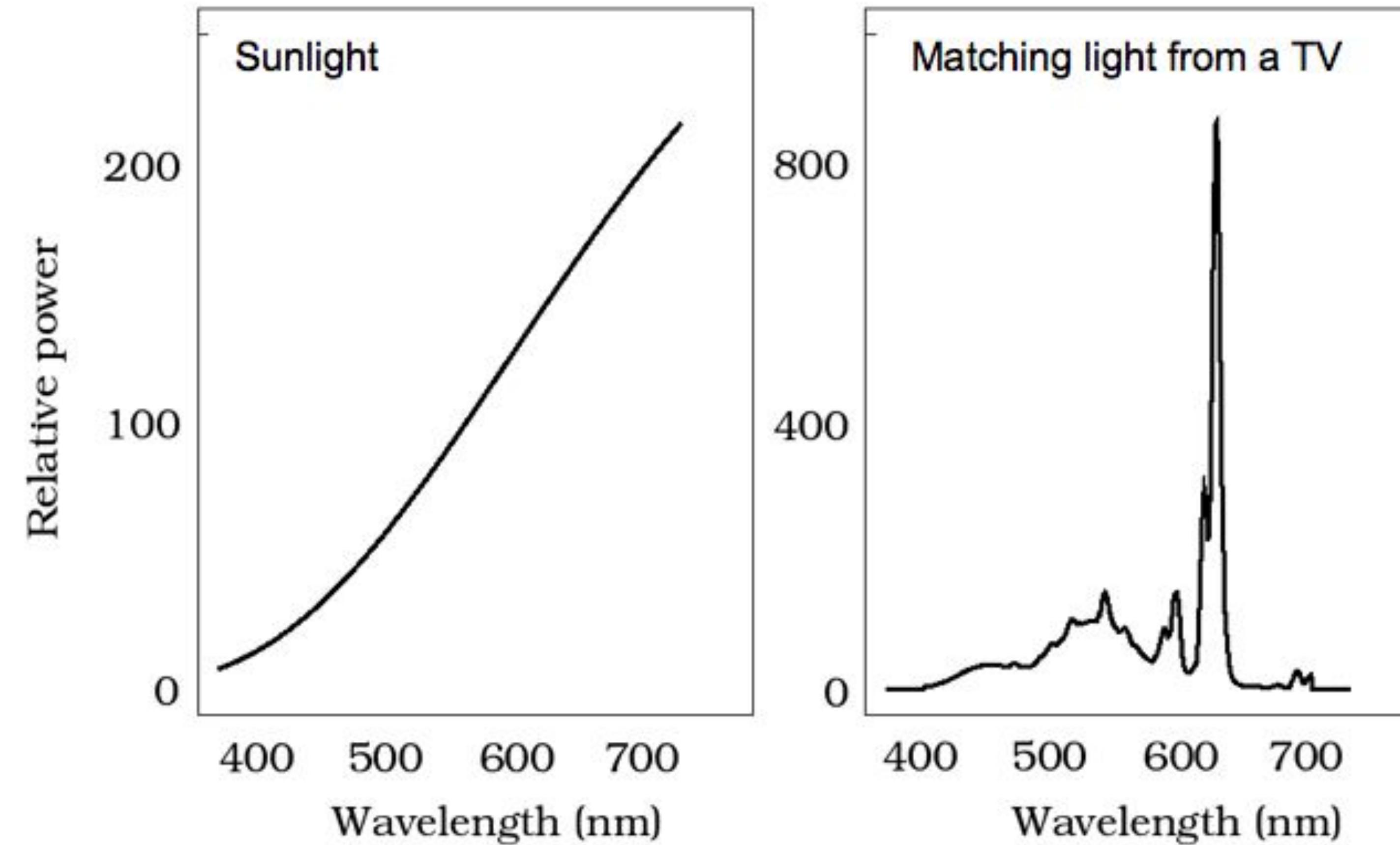
21.1



<http://hyperphysics.phy-astr.gsu.edu/hbase/vision/colcon.html>

# Metamers

Surfaces with **different** spectral power distributions can give the **same** tristimulus values



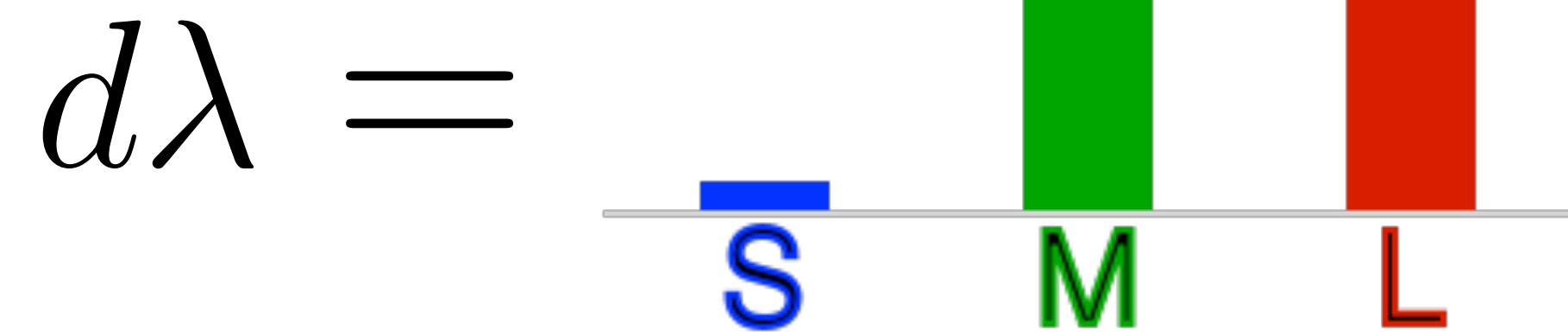
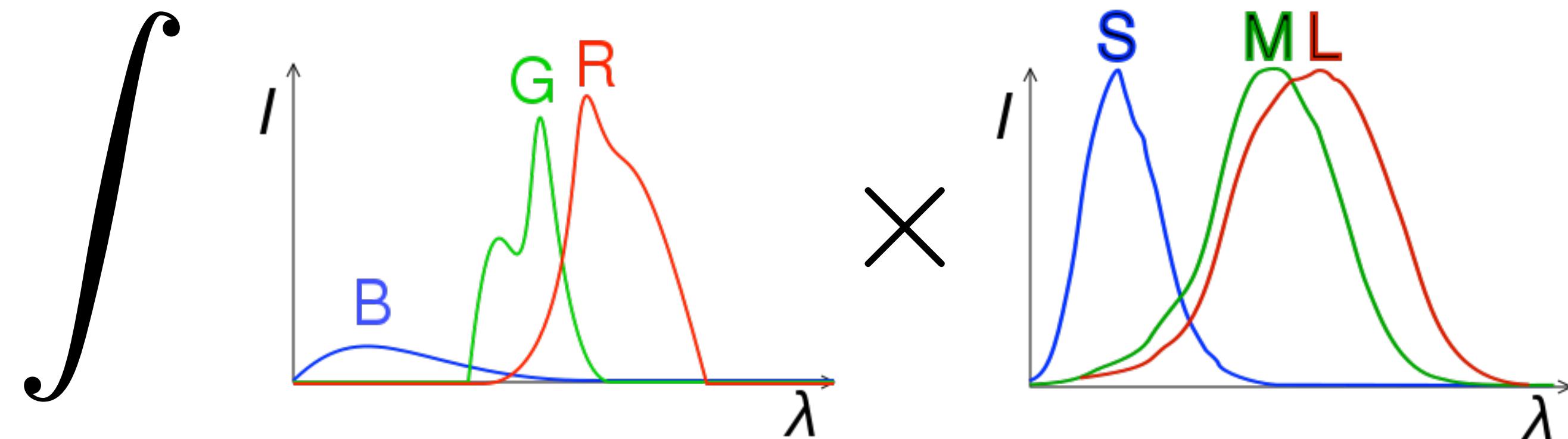
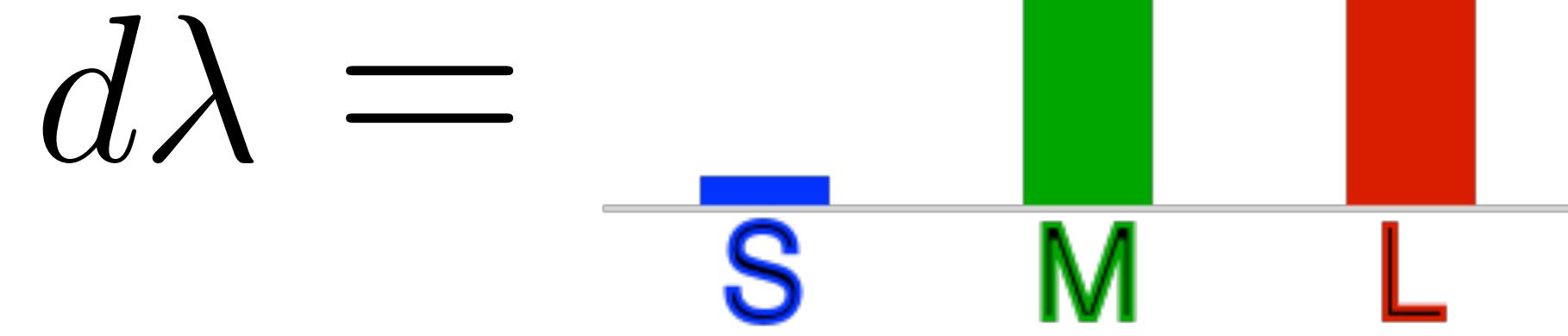
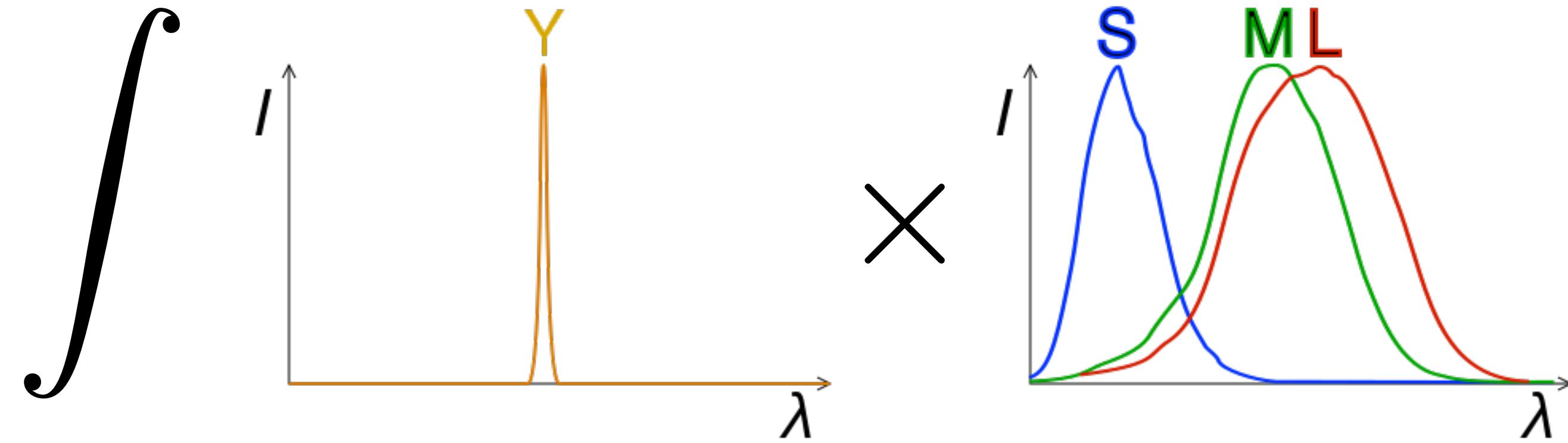
(A) A tungsten bulb

(B) TV monitor set to match (A)

**Figure credit:** Brian Wandell,  
Foundations of Vision,  
Sinauer Associates, 1995

# Metamers

[ Images: Wikipedia ]



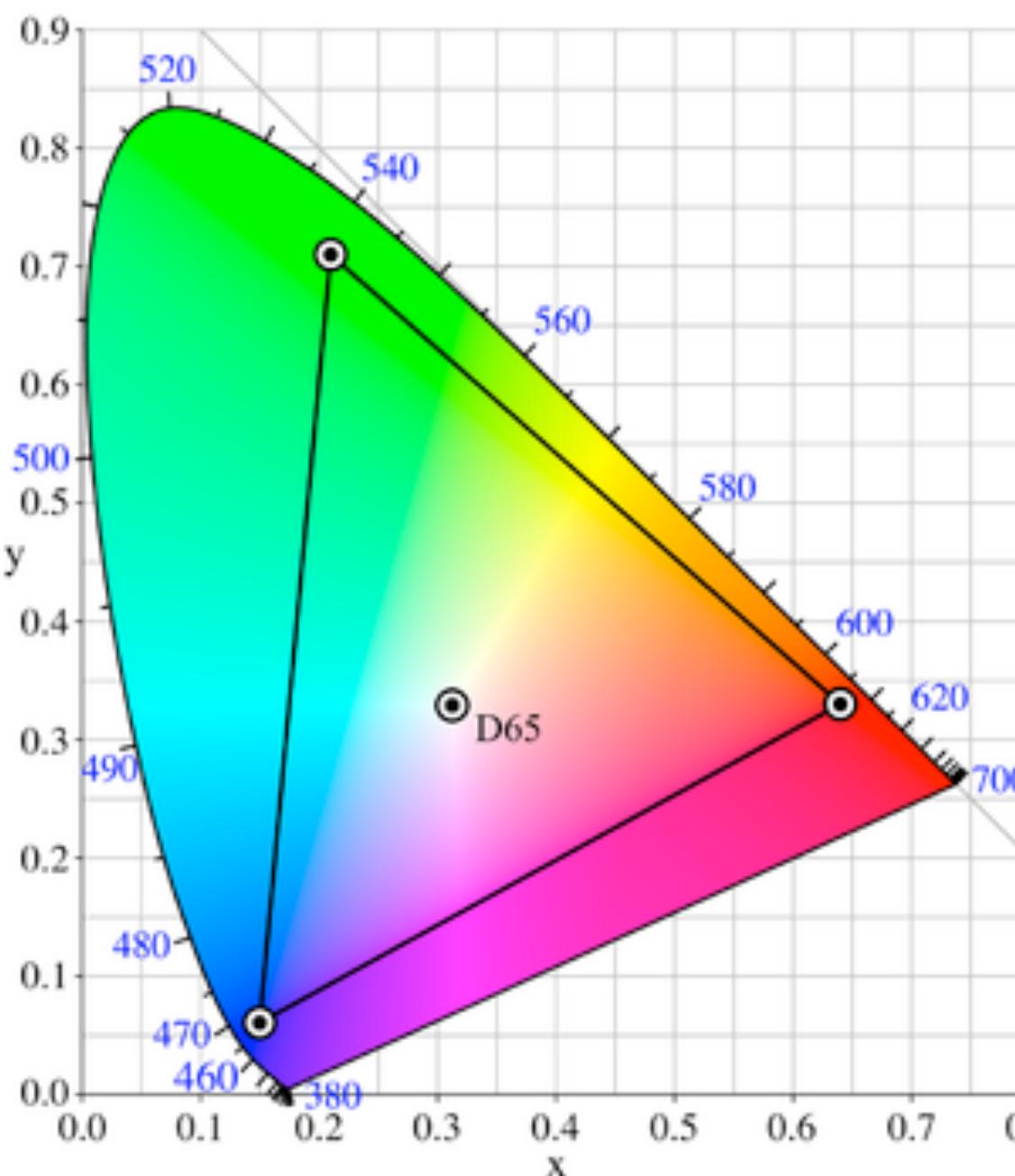
Different SPDs

Cone Response  
Curves

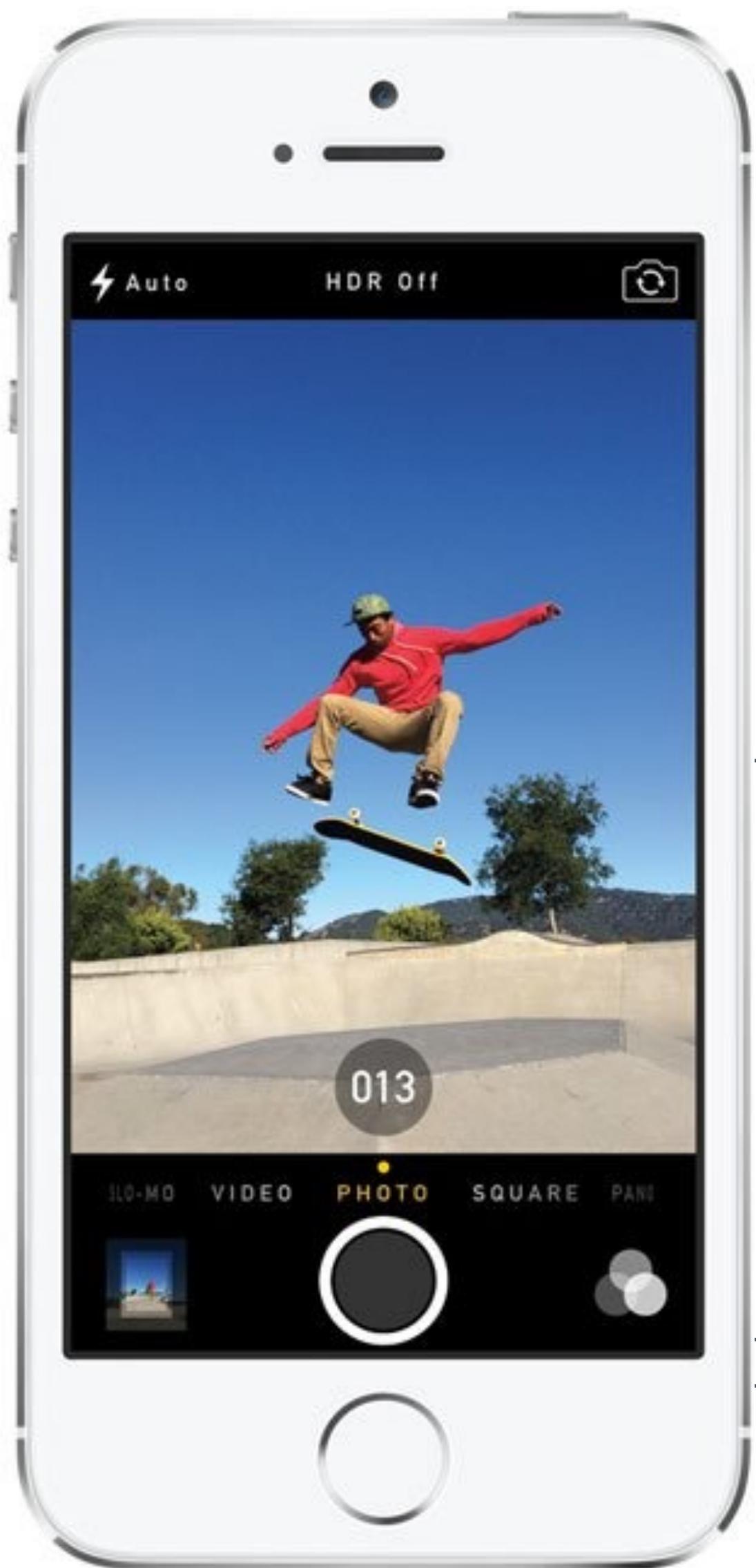
Same Tristimulus  
Responses = Perceived Colour

# Cones and Colour Displays

- Humans have trichromatic vision
- So we don't need to generate all possible spectra
  - many different spectra give same perceivable colour (metamers)
- In theory we need just 3 bases to generate all colours
- In practice it is hard to match human cones exactly
- RGB is a pretty good approximation (generates most colours with positive values)



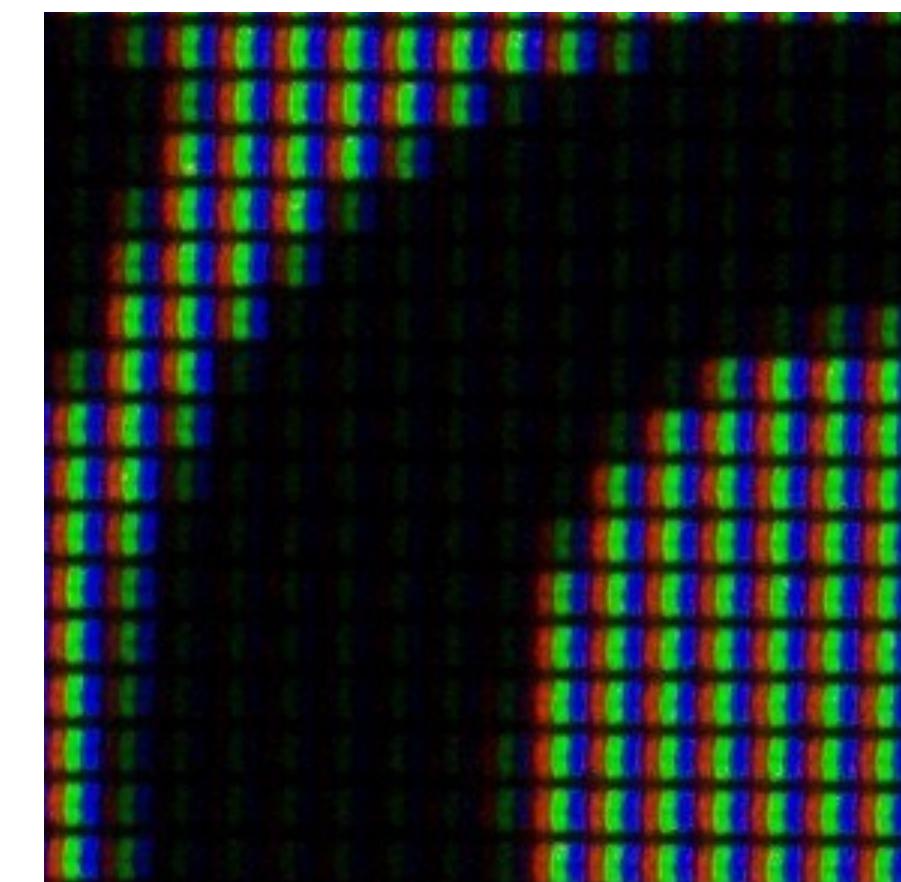
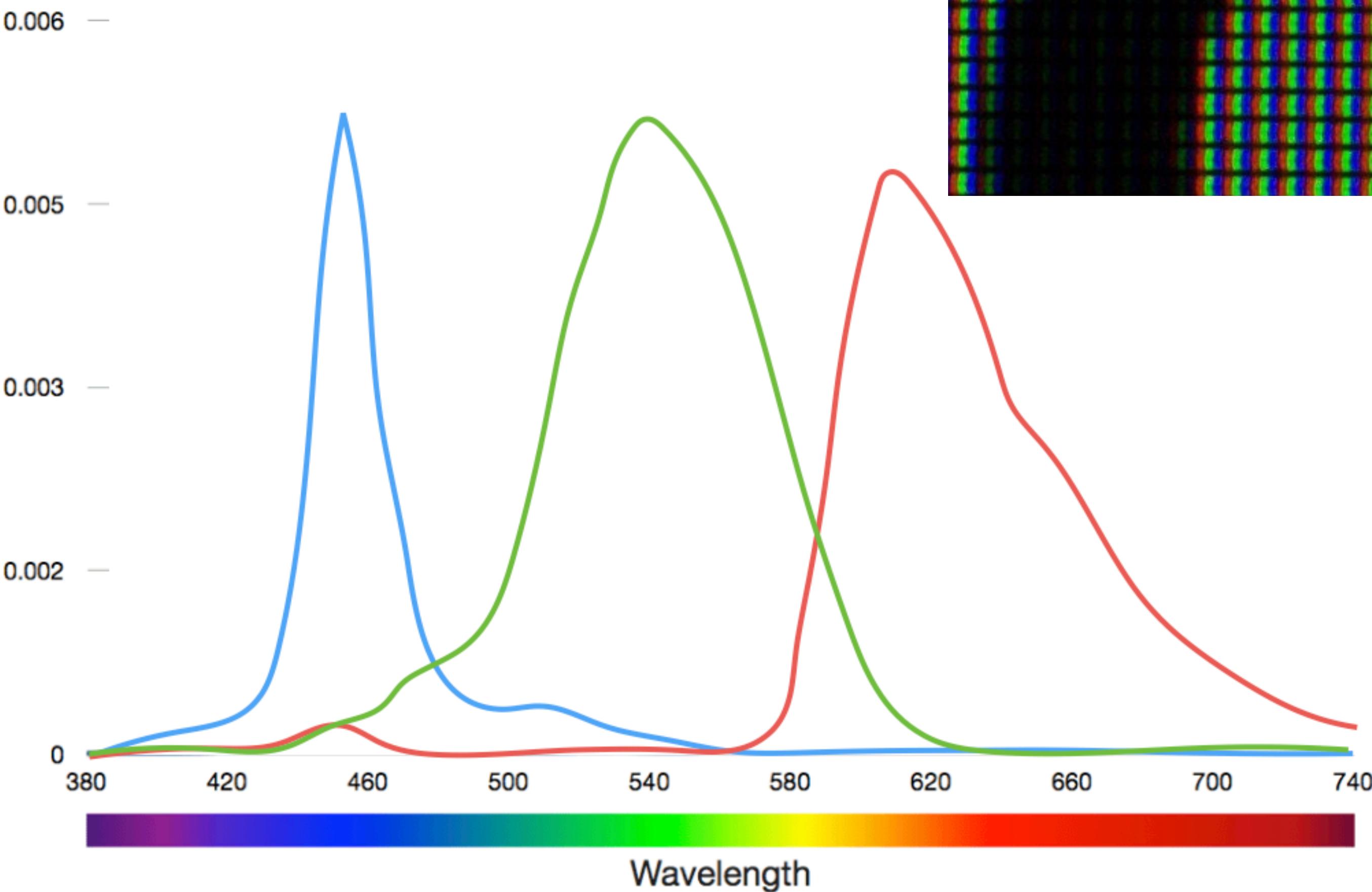
[ Adobe '98  
RGB Gamut ]



<https://www.macrumors.com/roundup/iphone-5s/>

## RGB pixel spectra (iPhone 5)

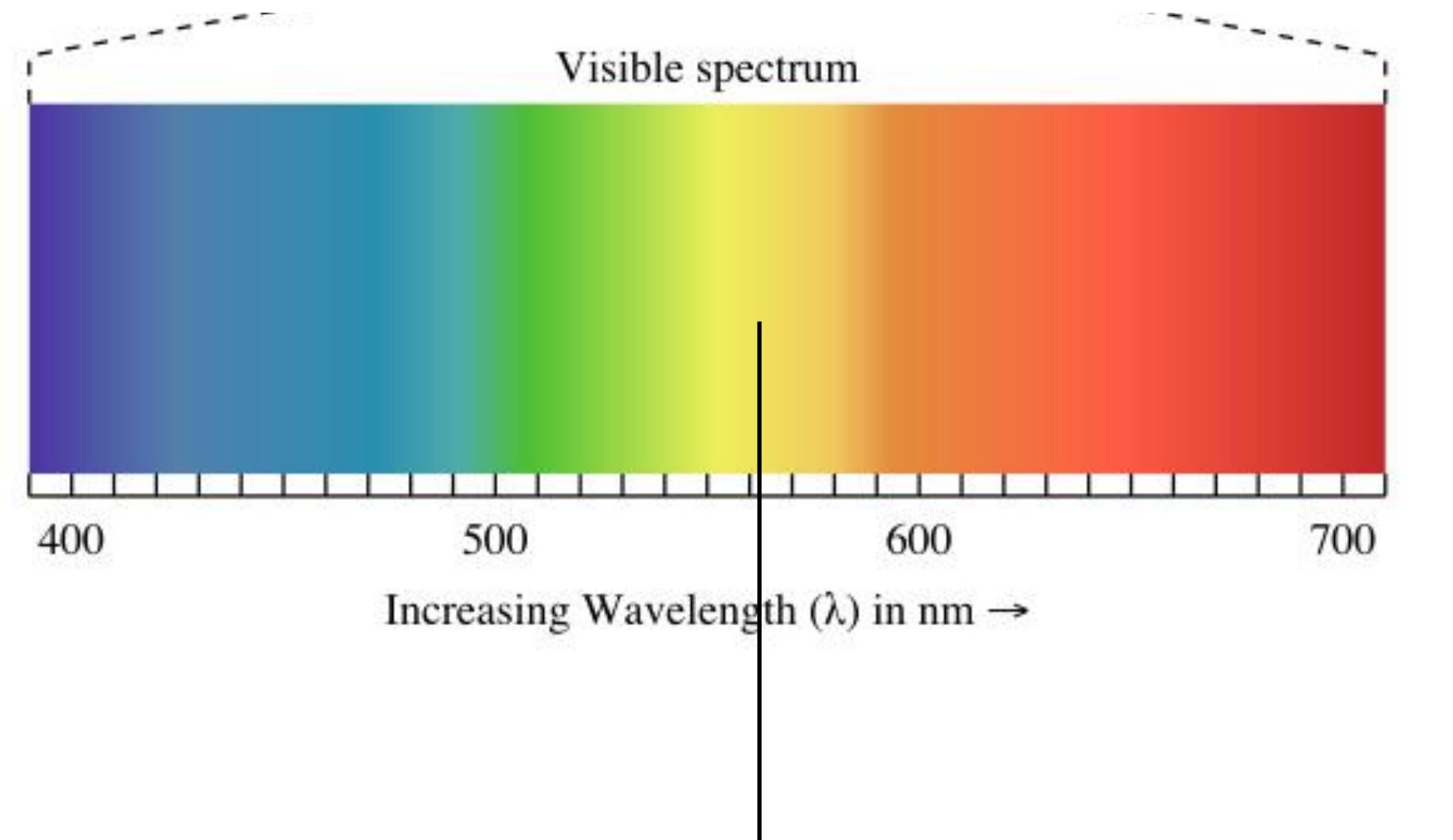
Credit: Yurek, <https://dot-color.com/tag/color-2/page/2/>



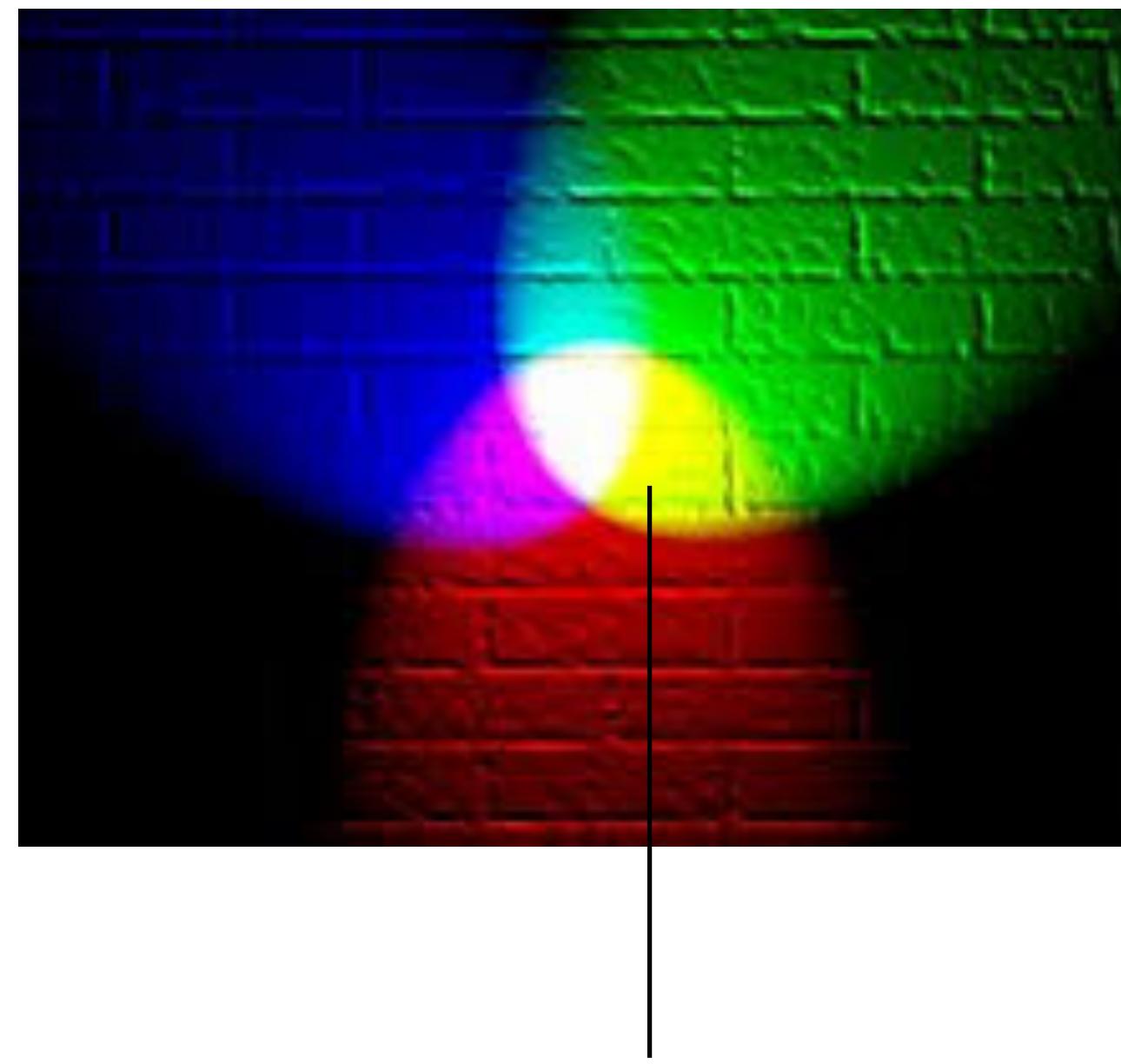
Ren Ng

iPhone 6S

# Color Matching



**Pure** Color  
(580 nm)

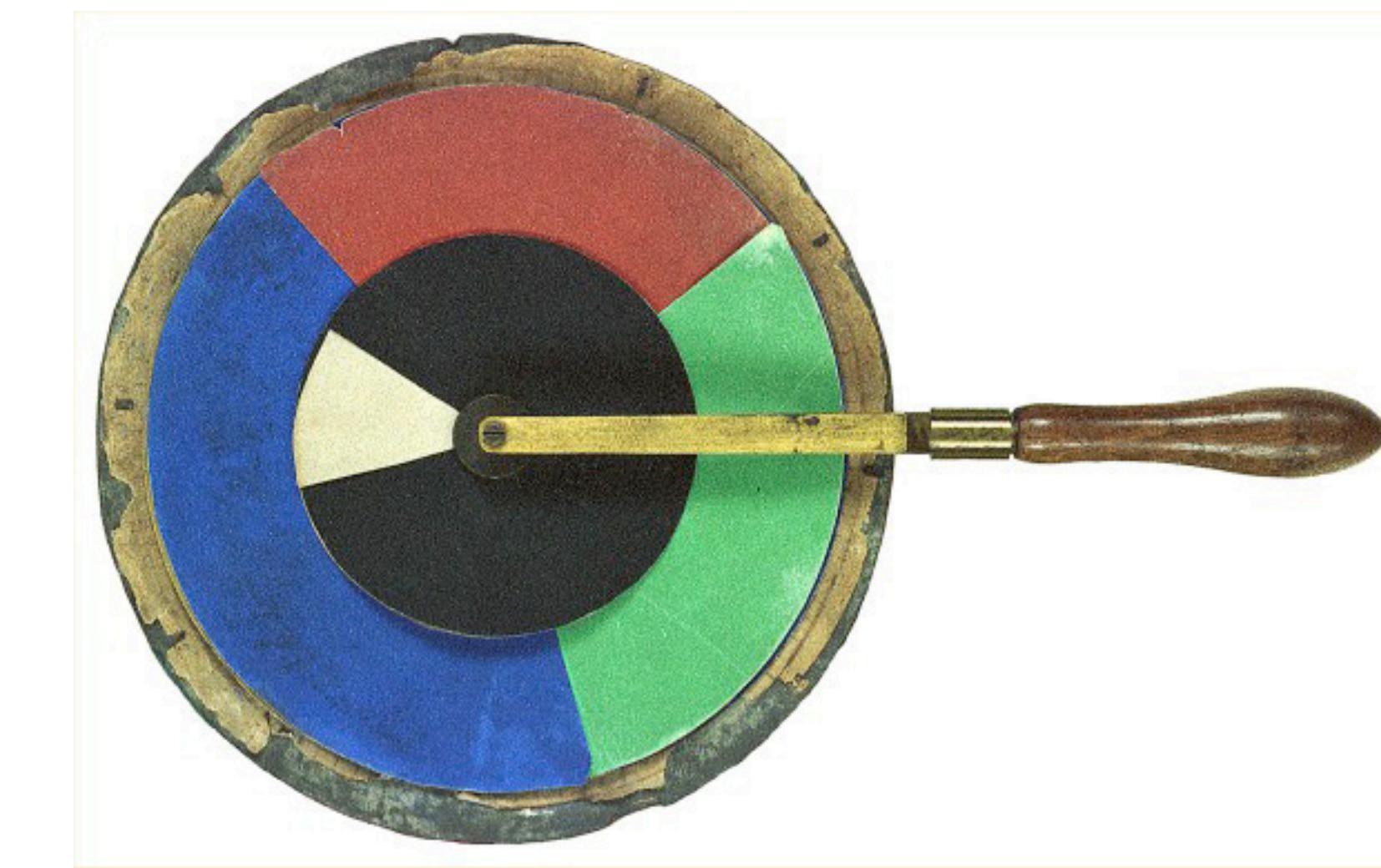


**Additively** Mixing  
Primary Colors

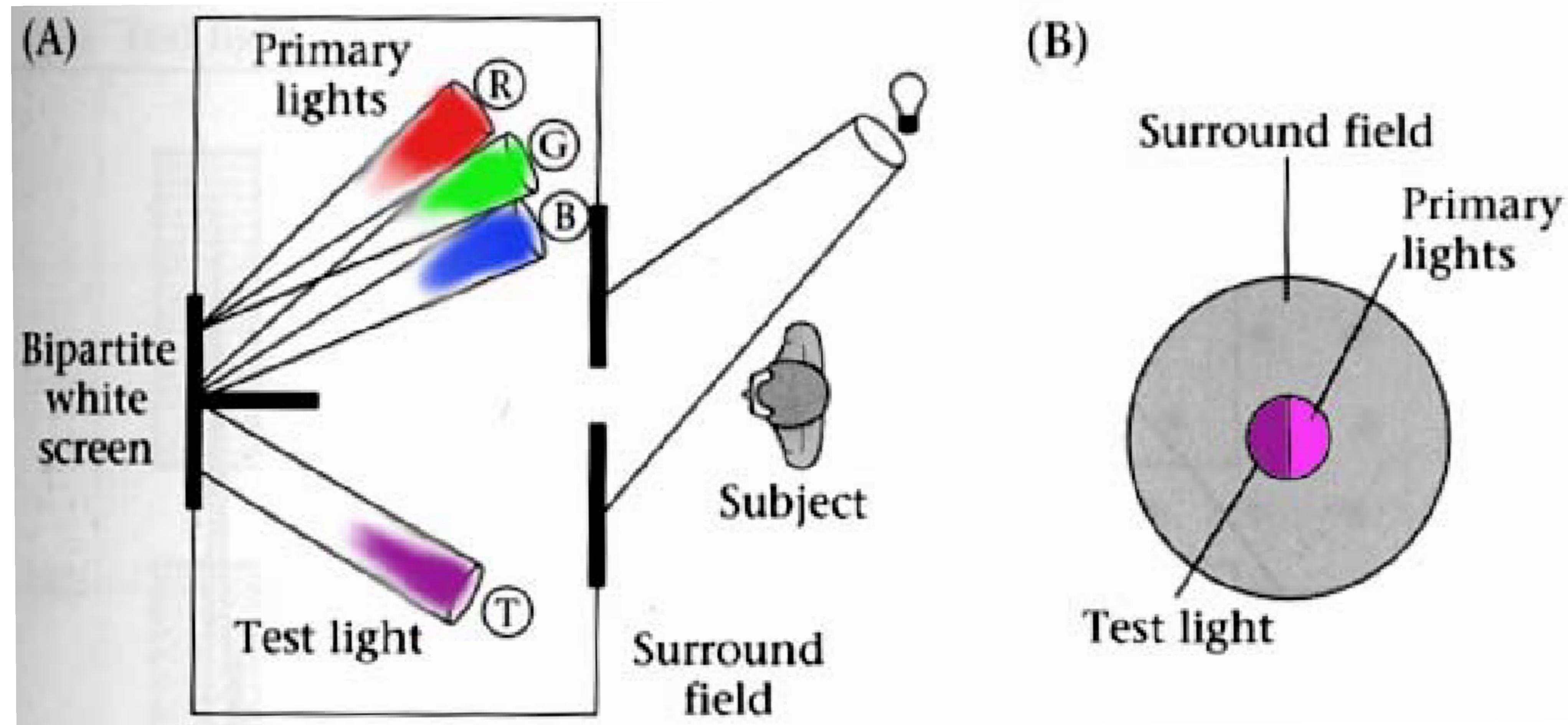
Red - 700nm  
Green - 546nm  
Blue - 435nm

# Maxwell Colour Matching Experiments

Maxwell mixed colours by rapidly spinning a top with different fractions of primaries, e.g., to match a central colour

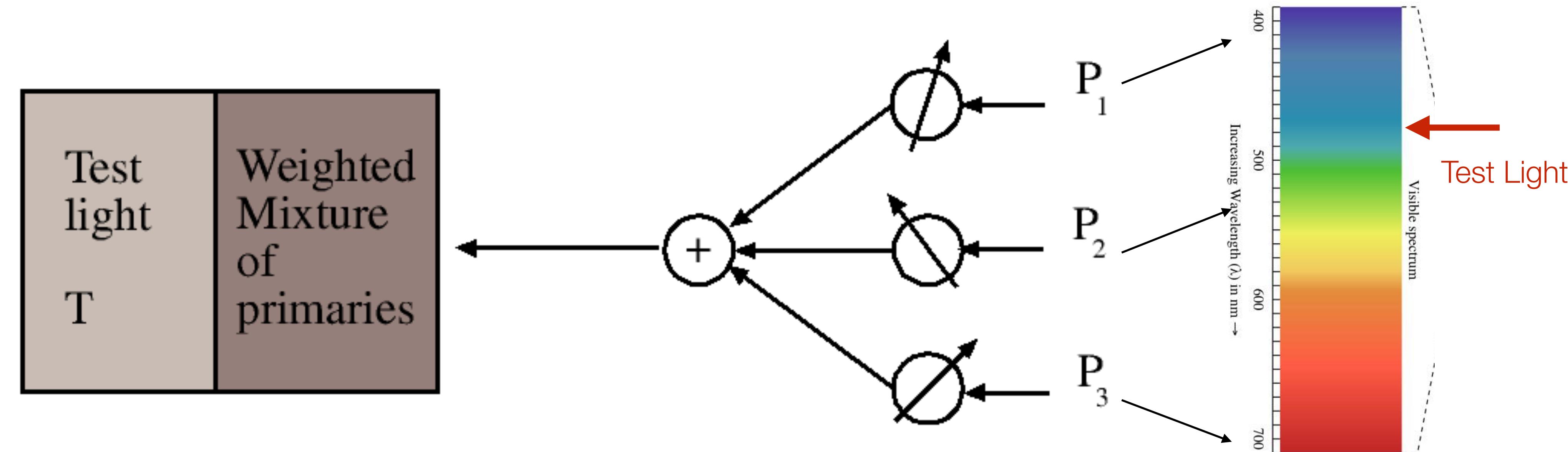


# Color Matching Experiments



**Figure Credit:** Brian Wandell, Foundations of Vision,  
Sinauer Associates, 1995

# Color Matching Experiments

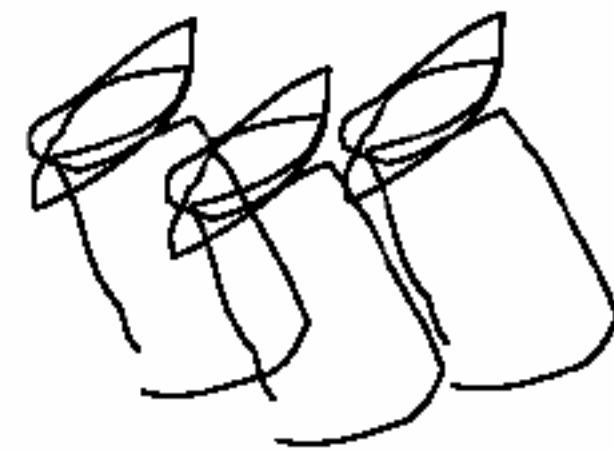
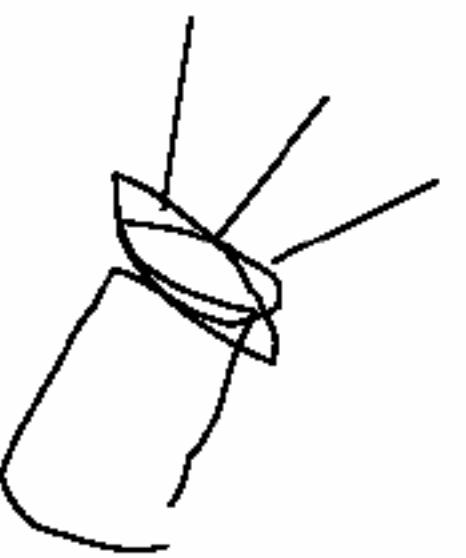
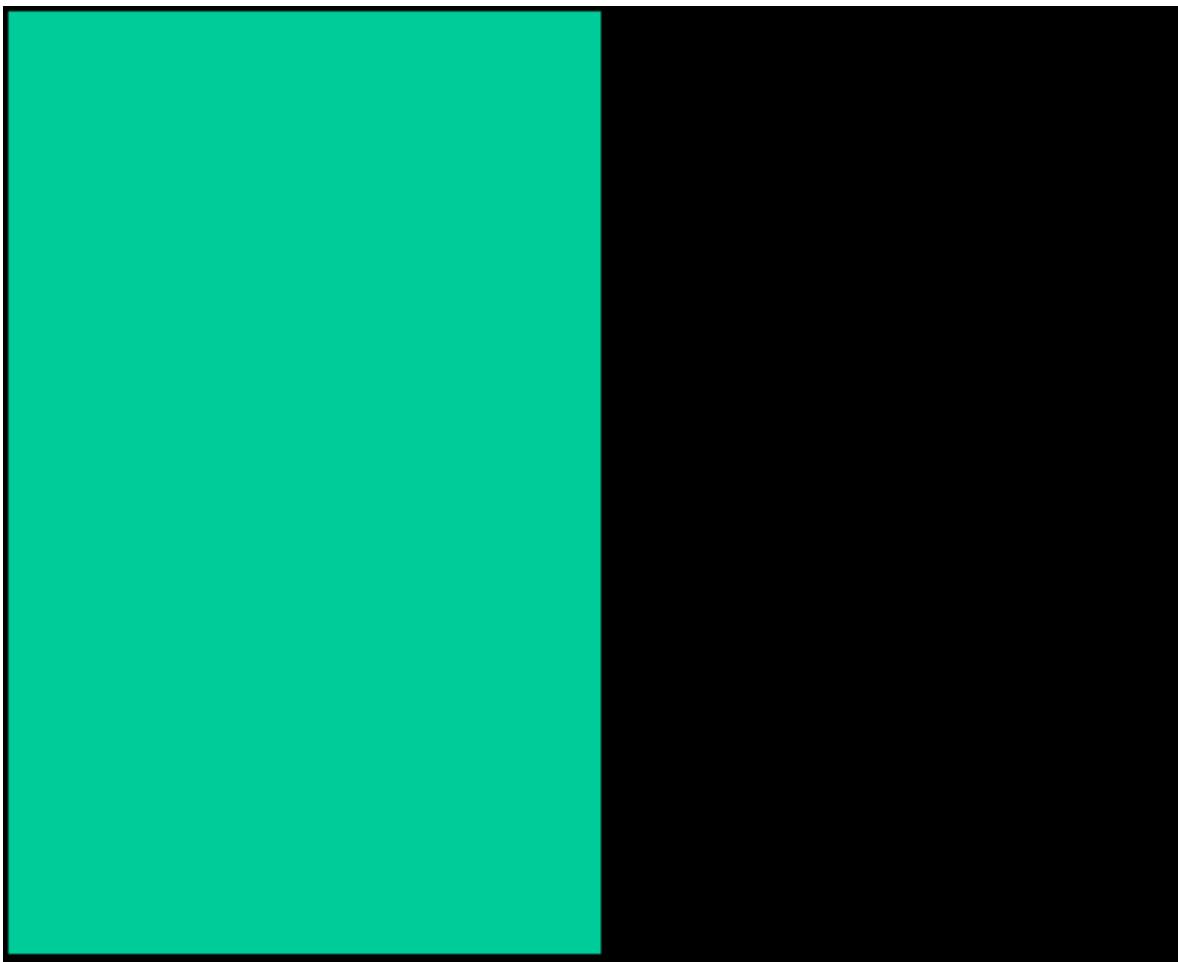


Forsyth & Ponce (2nd ed.) Figure 3.2

Show a split field to subjects. One side shows the light whose colour one wants to match. The other a weighted mixture of three primaries (fixed lights)

$$T = w_1 P_1 + w_2 P_2 + w_3 P_3$$

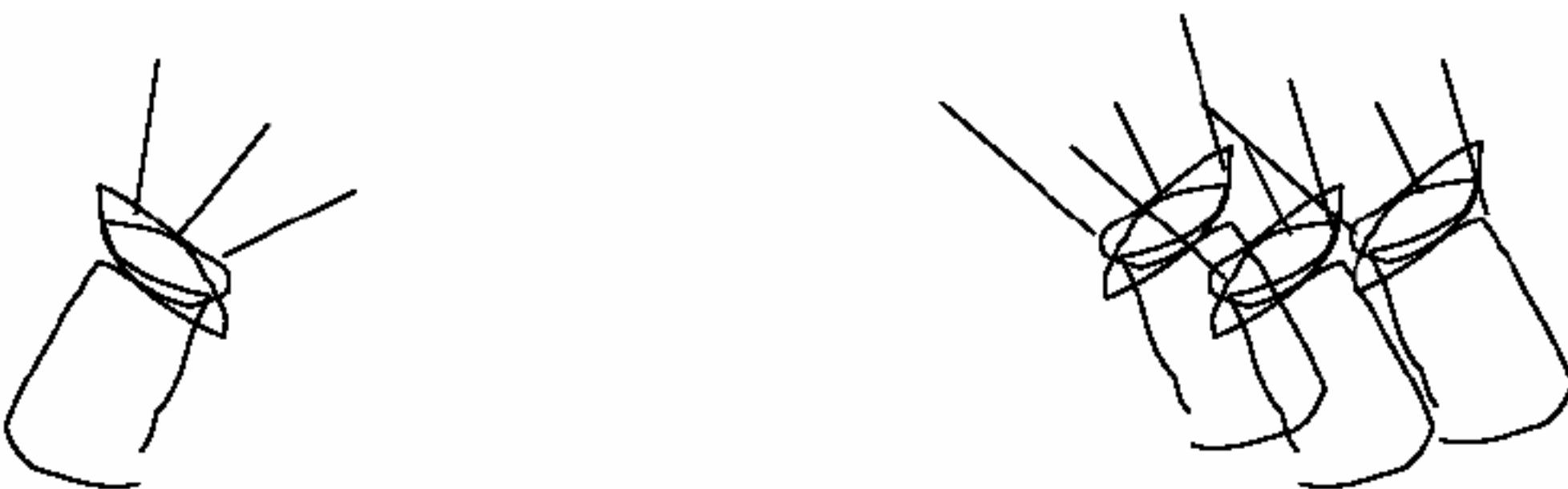
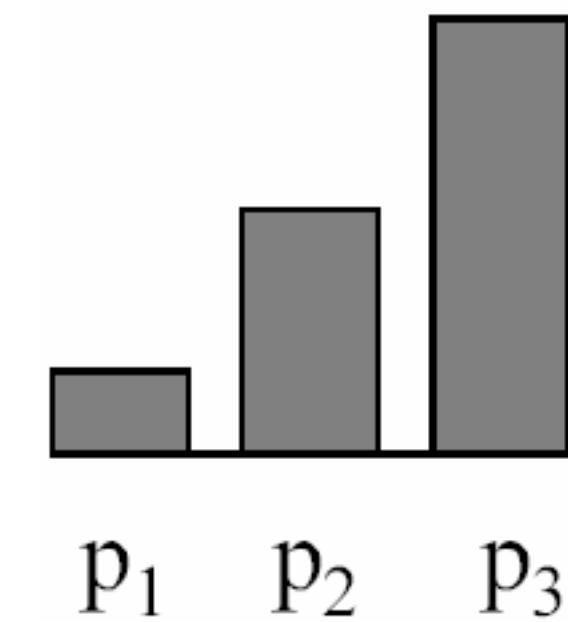
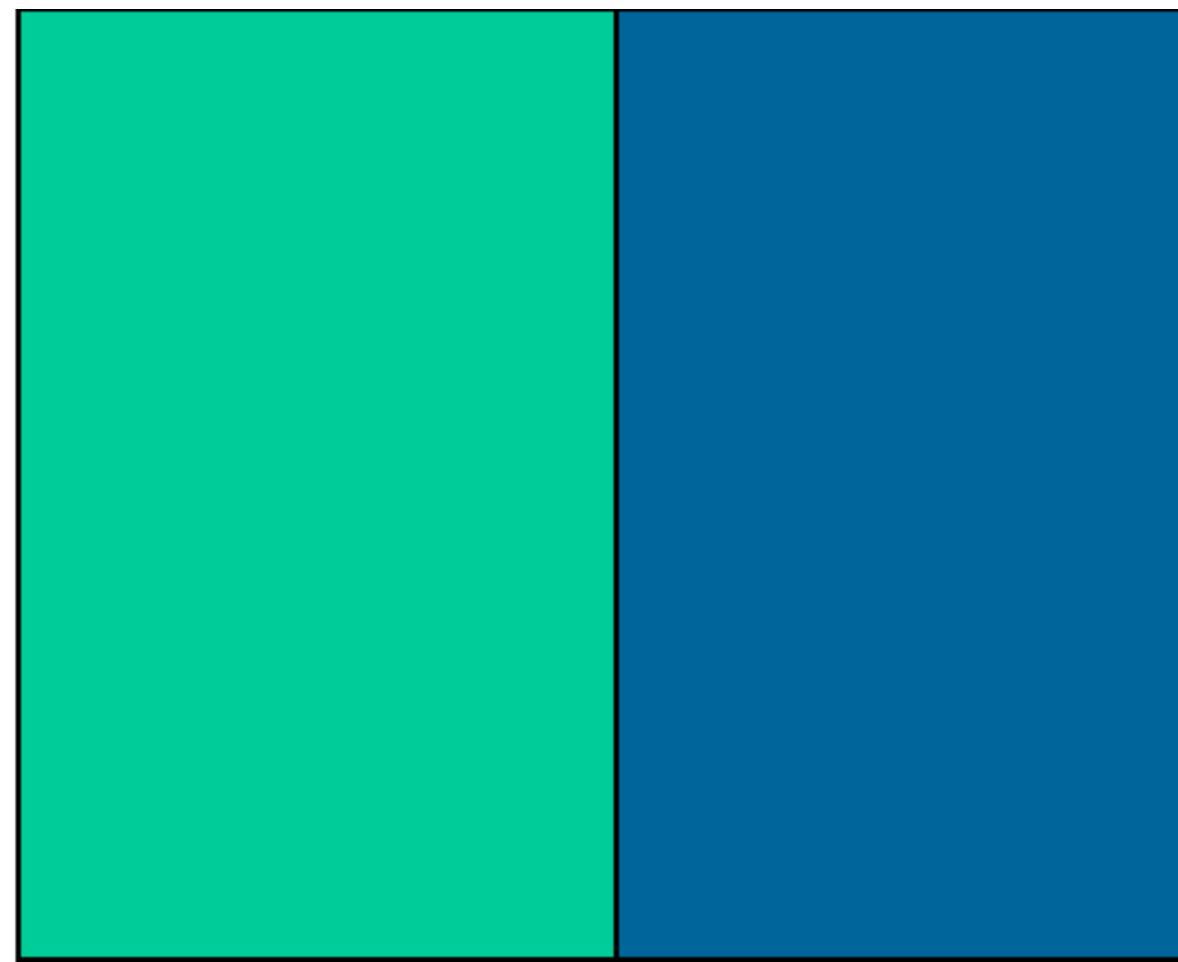
# Example 1: Color Matching Experiment



**knobs here**

**Example Credit:** Bill Freeman

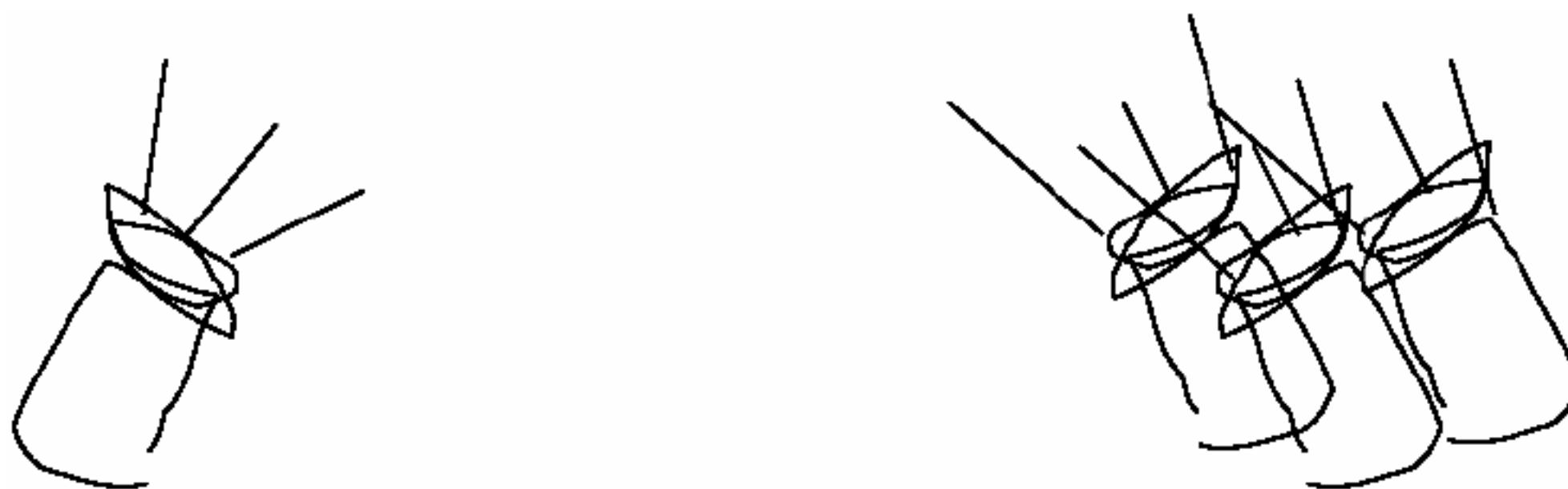
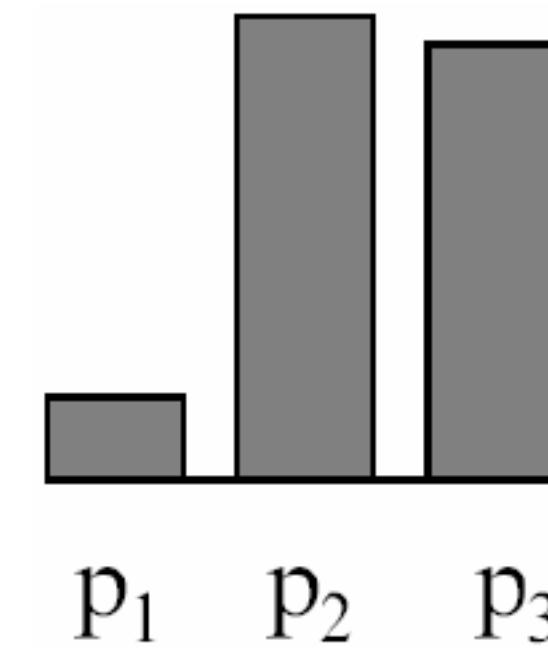
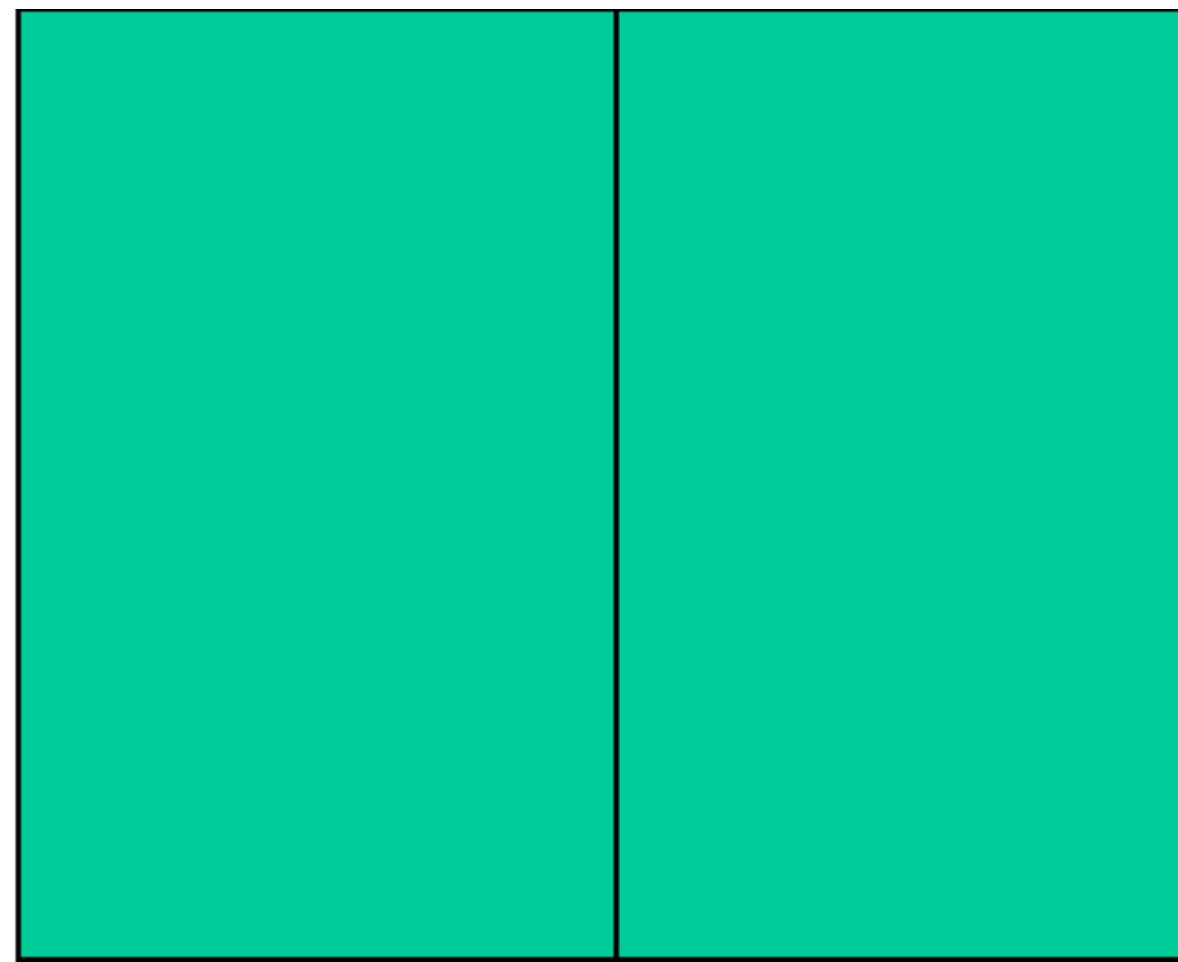
# Example 1: Color Matching Experiment



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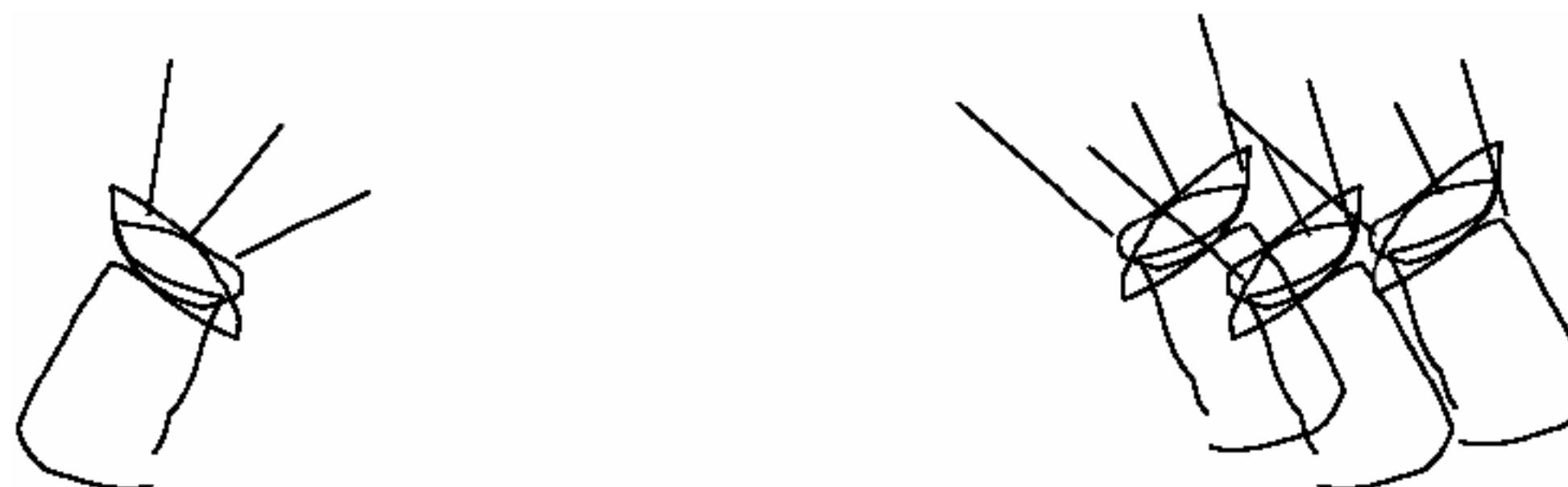
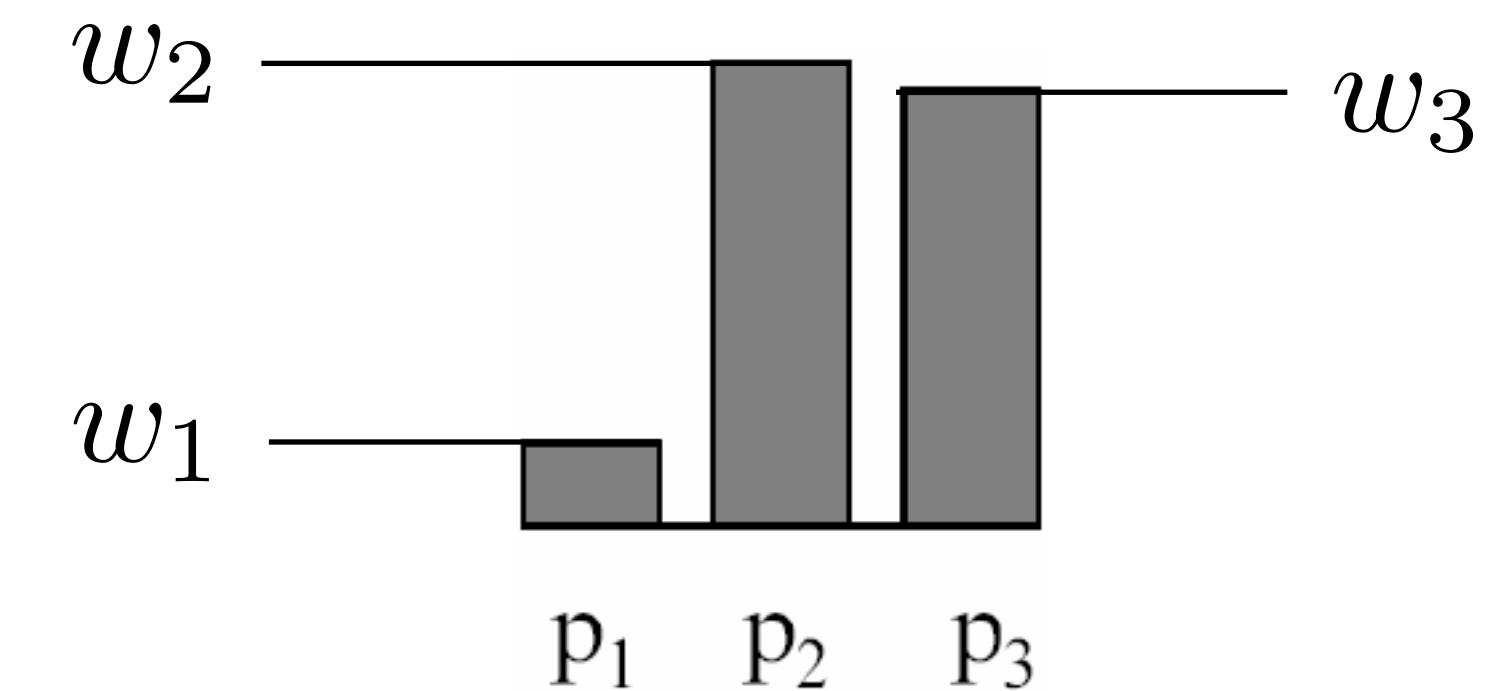
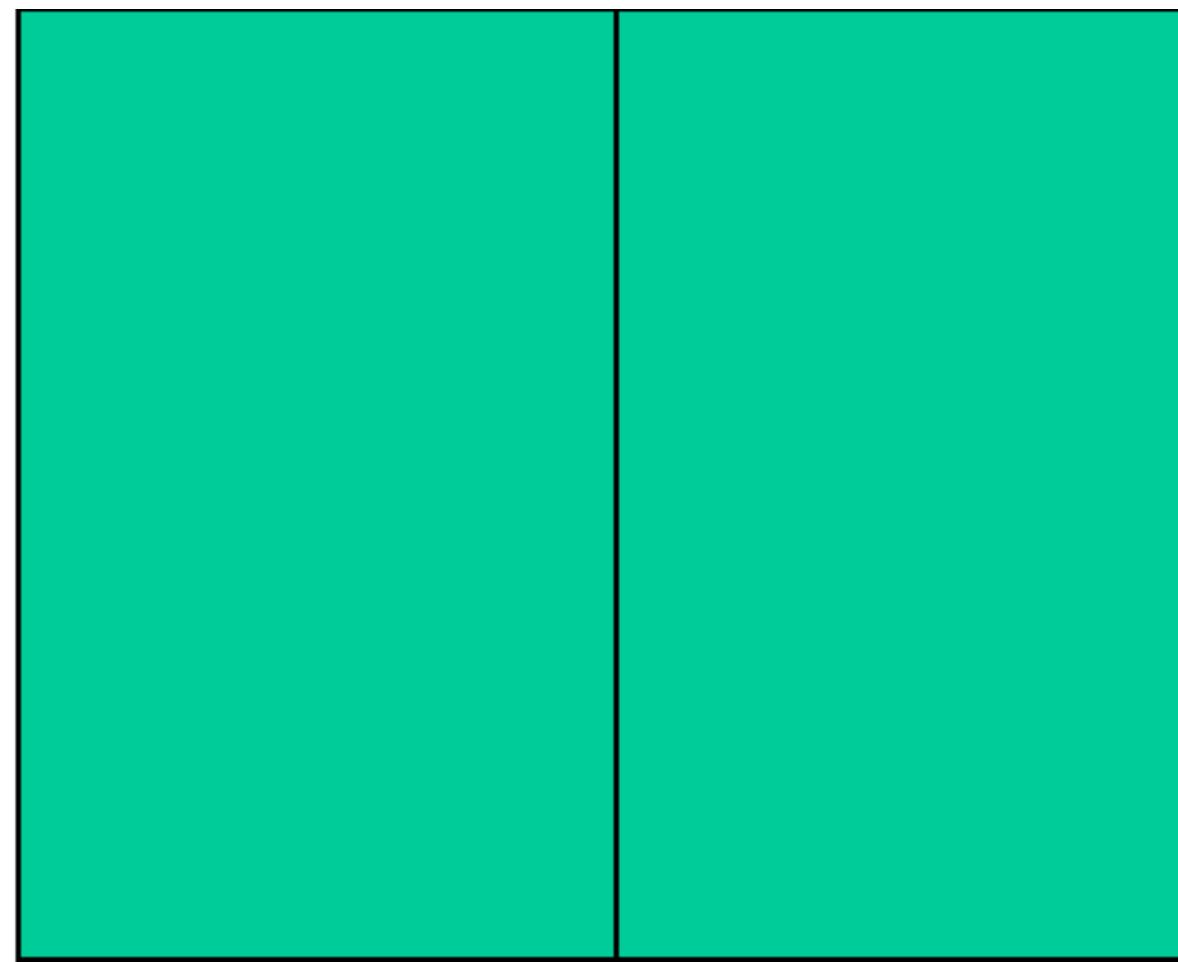
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**Example Credit:** Bill Freeman

# Example 1: Color Matching Experiment

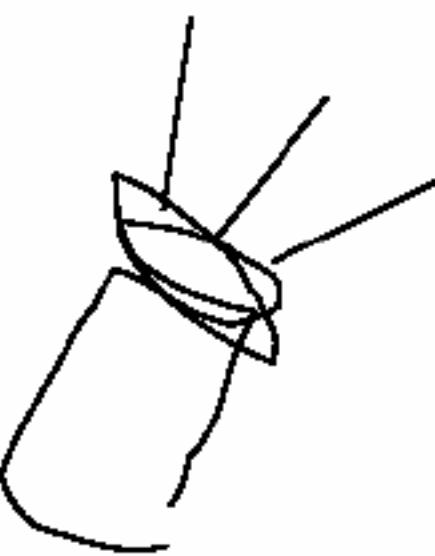
$$T = w_1 P_1 + w_2 P_2 + w_3 P_3$$



**knobs here**

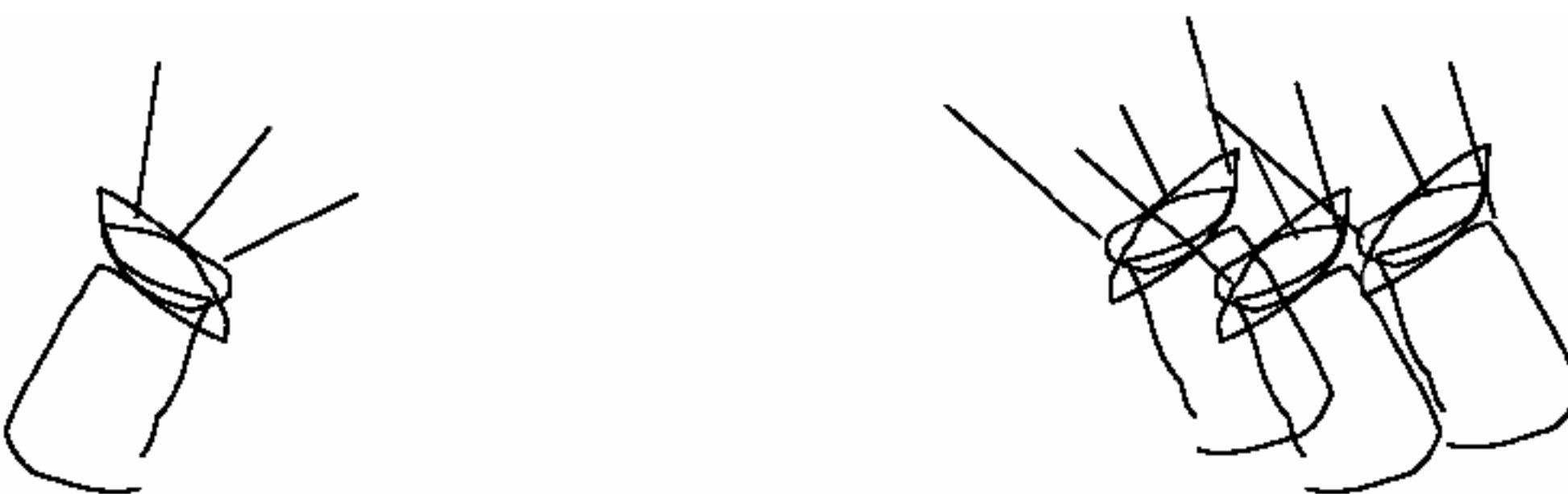
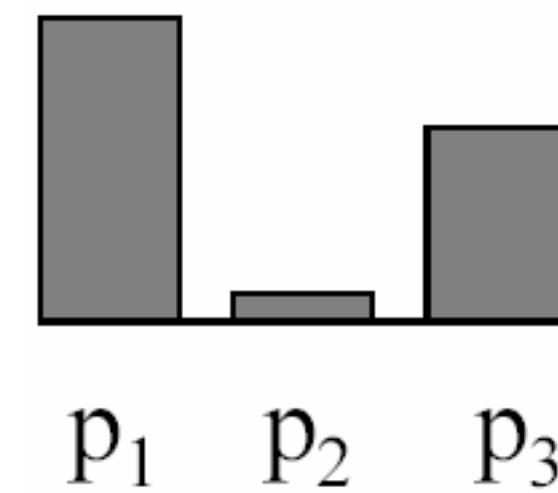
**Example Credit:** Bill Freeman

# Example 2: Color Matching Experiment



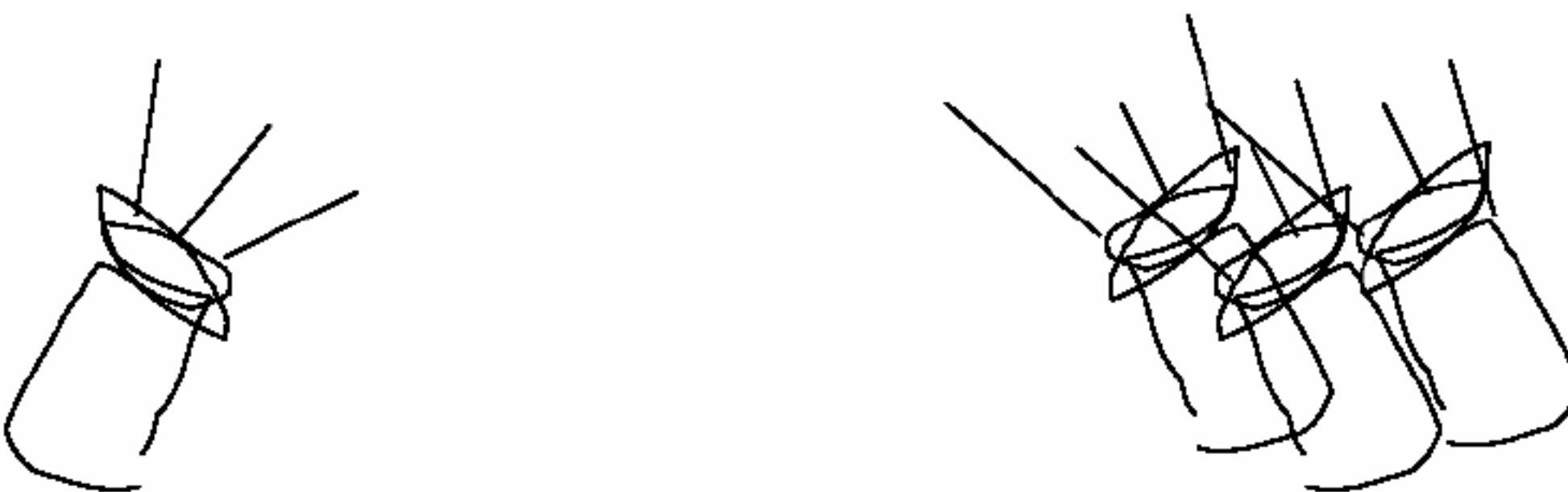
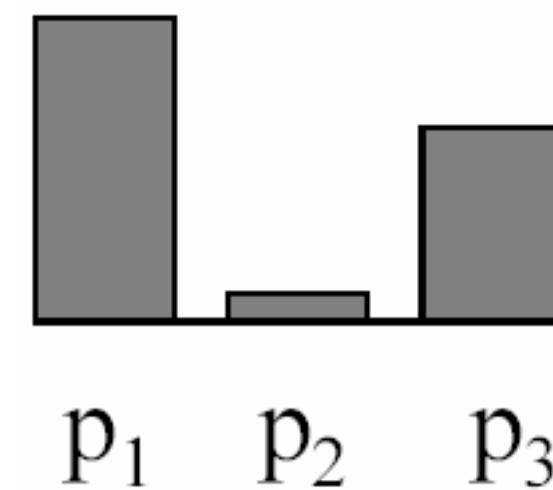
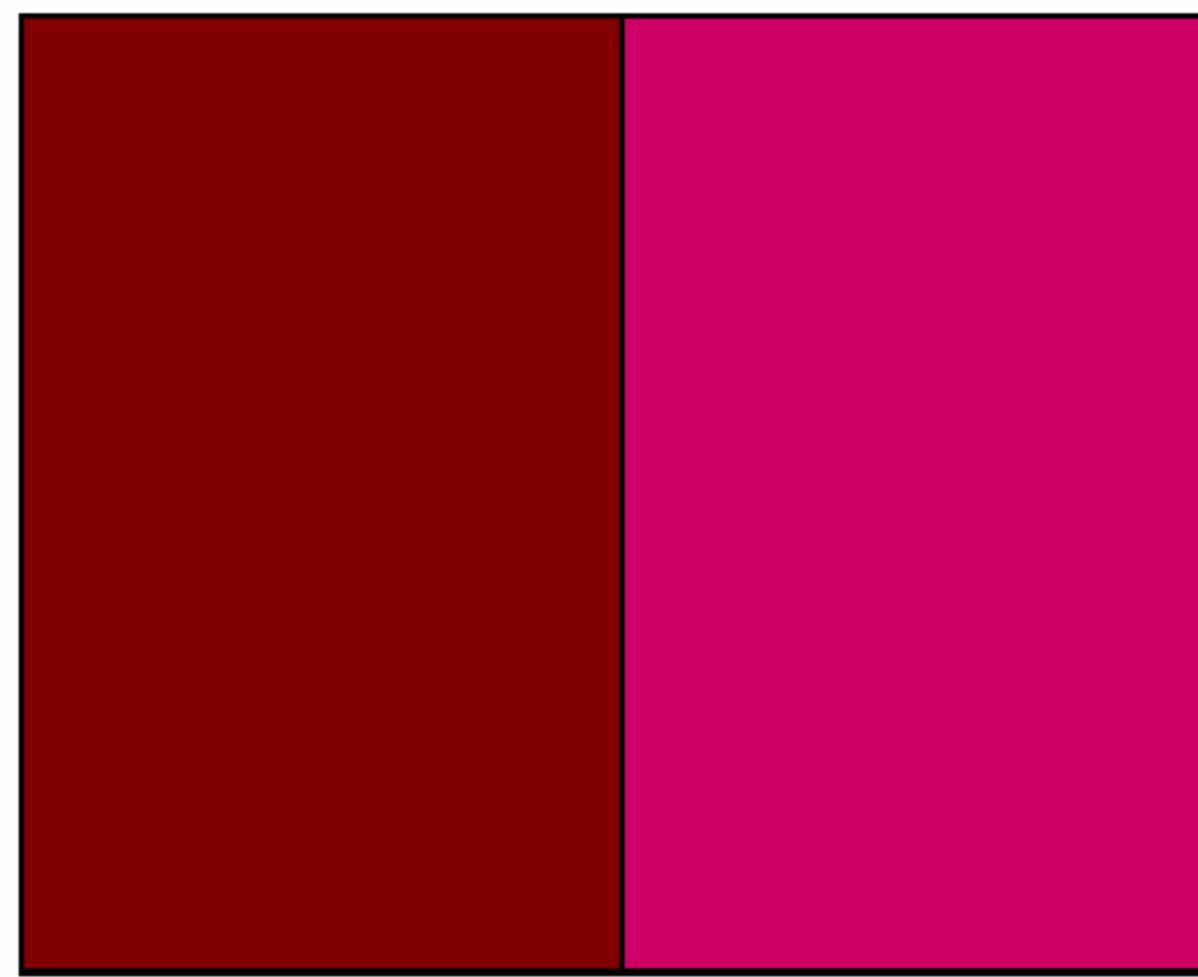
**Example Credit:** Bill Freeman

# Example 2: Color Matching Experiment



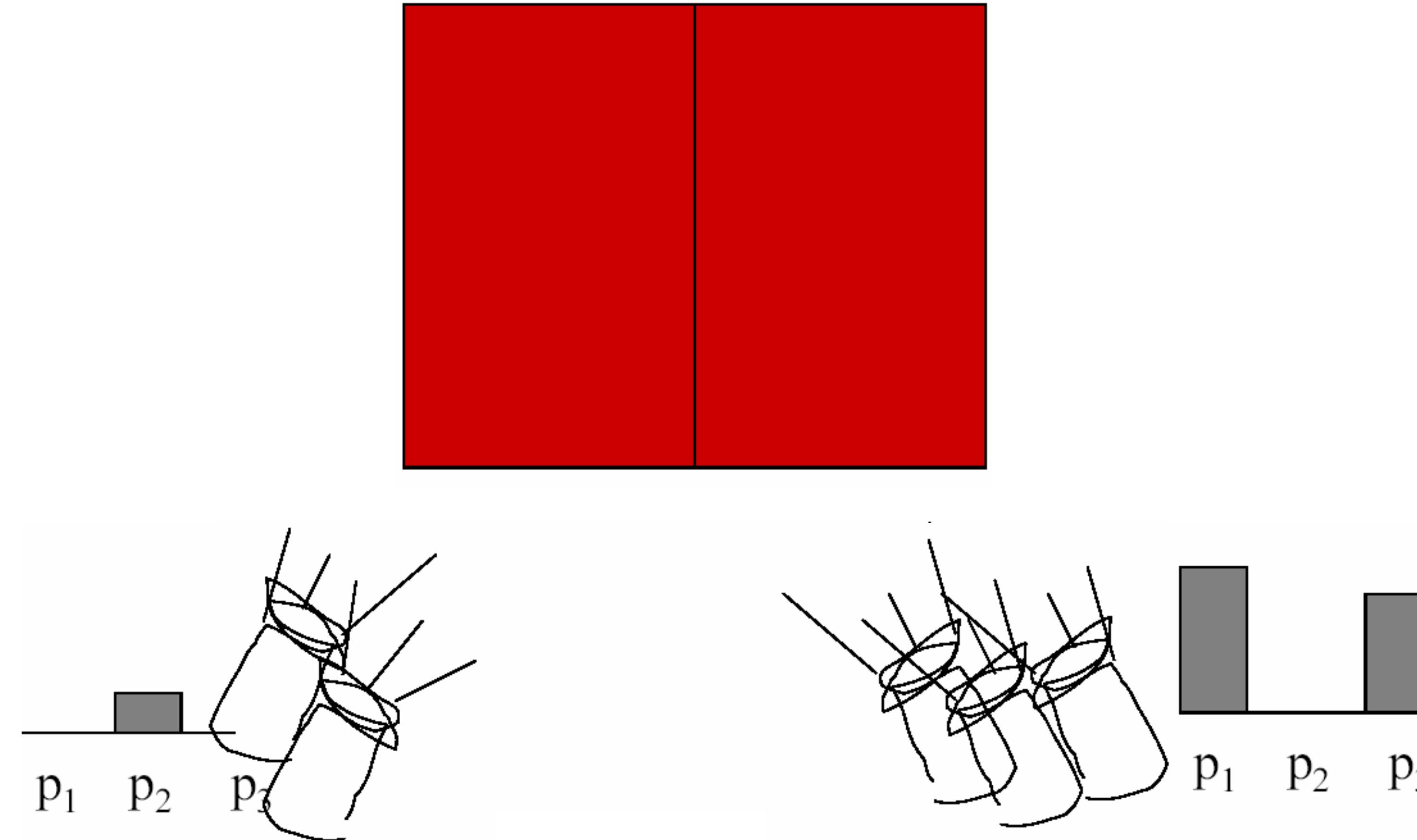
**Example Credit:** Bill Freeman

# Example 2: Color Matching Experiment



**Example Credit:** Bill Freeman

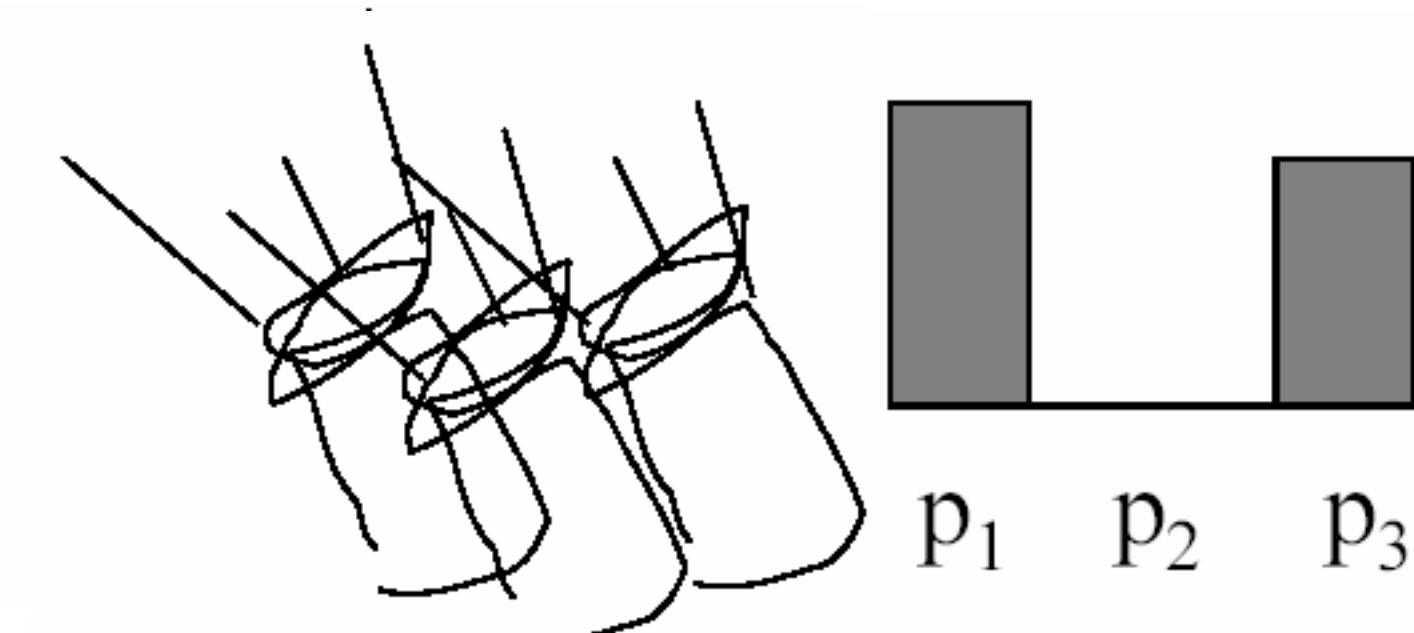
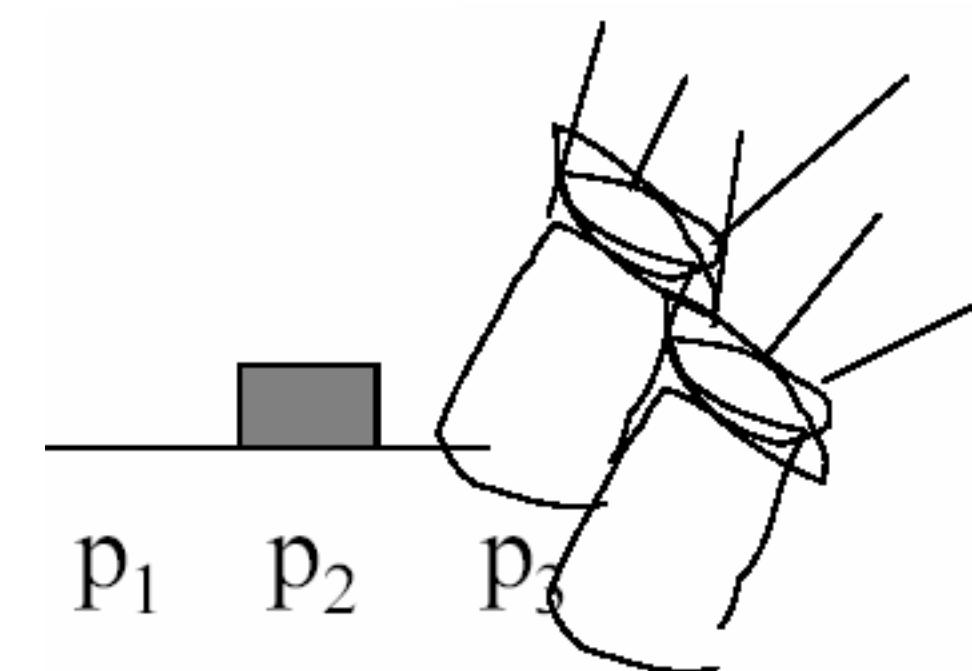
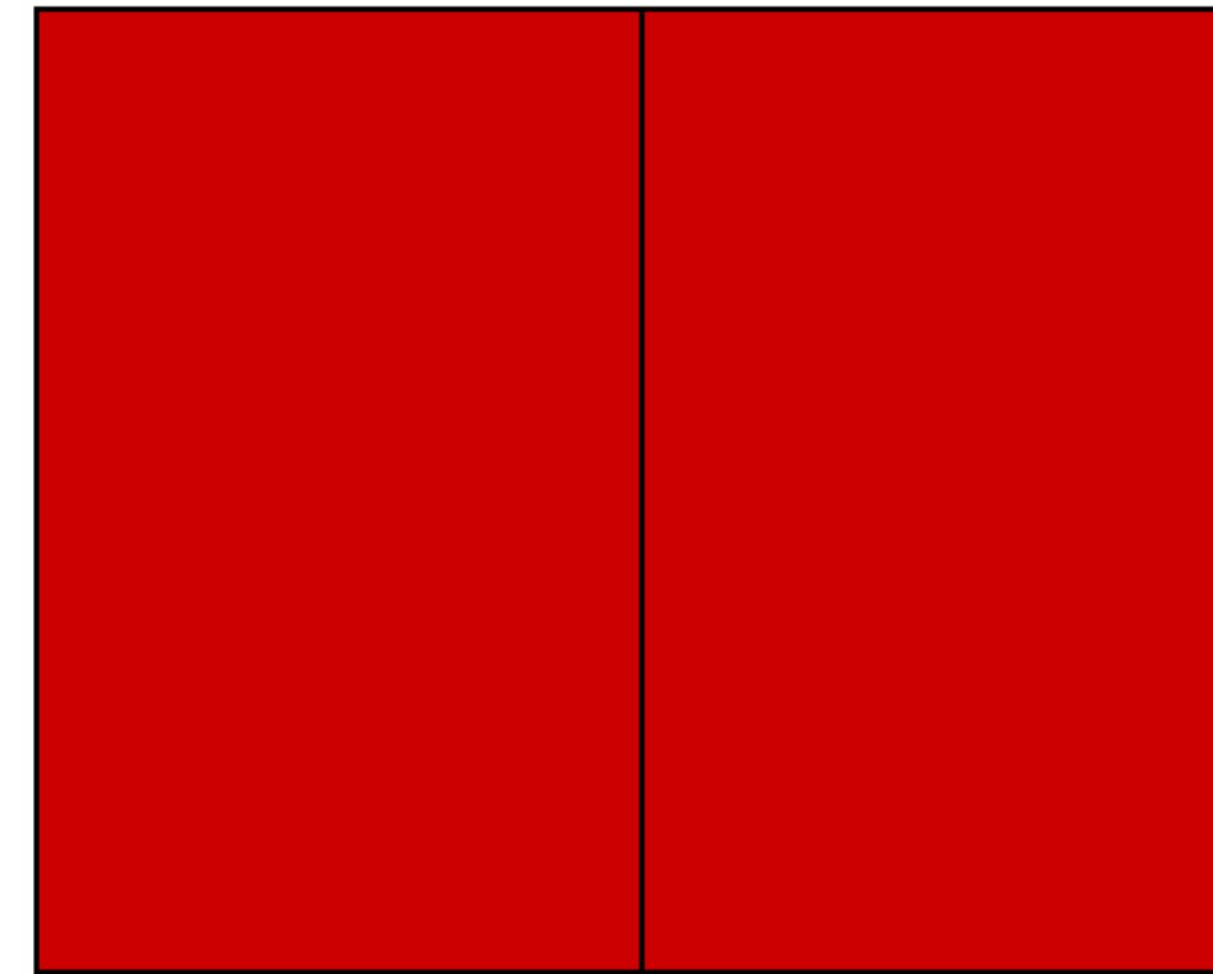
# Example 2: Color Matching Experiment



**Example Credit:** Bill Freeman

# Example 2: Color Matching Experiment

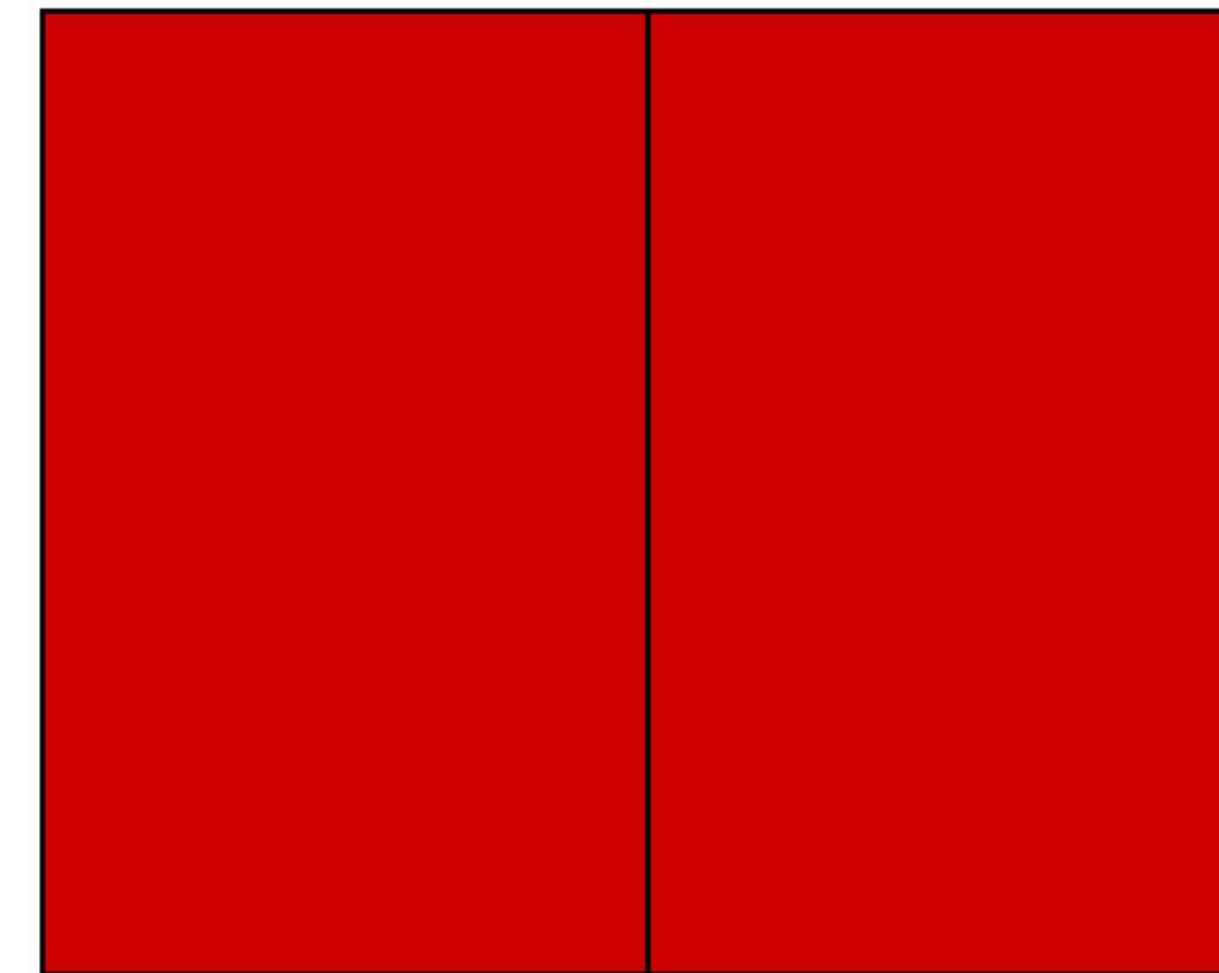
We say a “negative” amount of  $P_2$  was needed to make a match , because we added it to the test color side



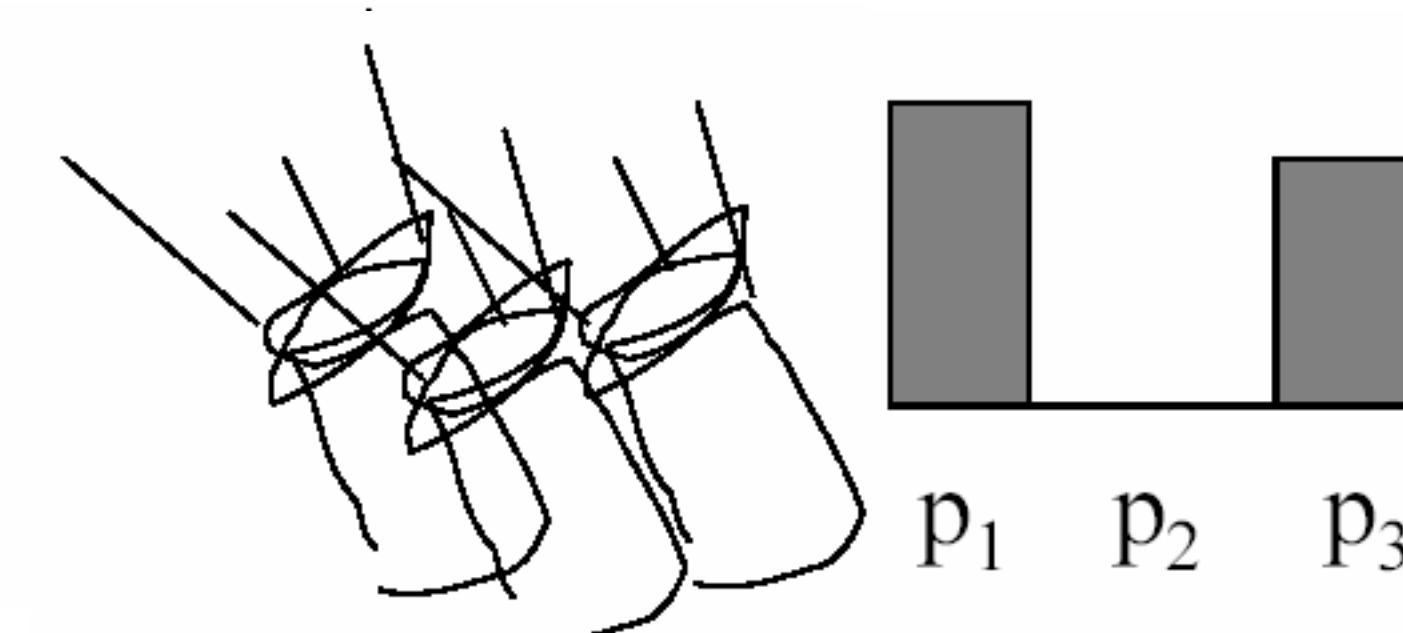
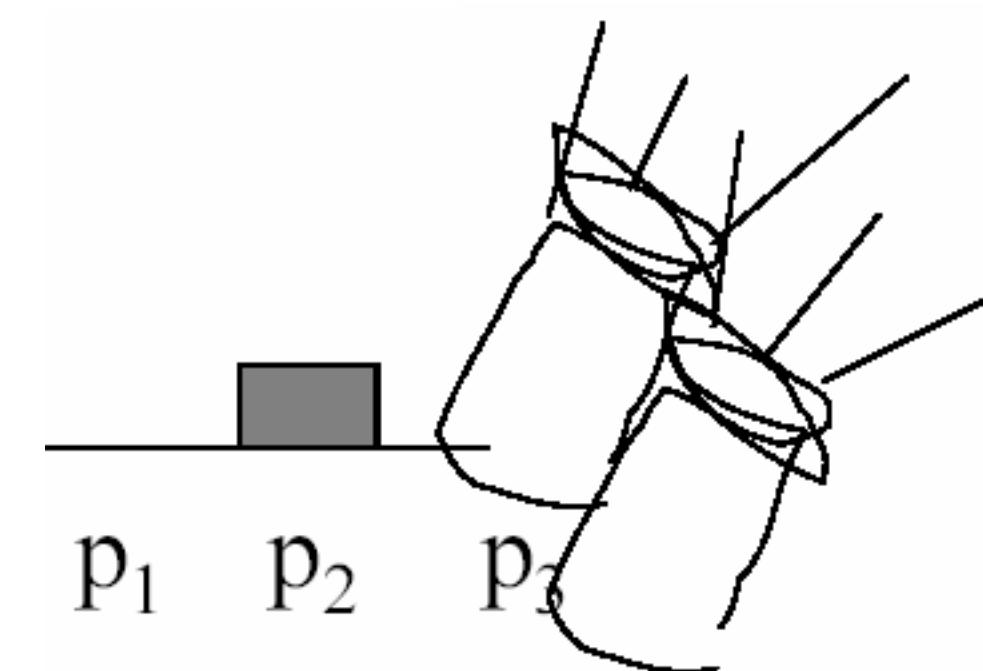
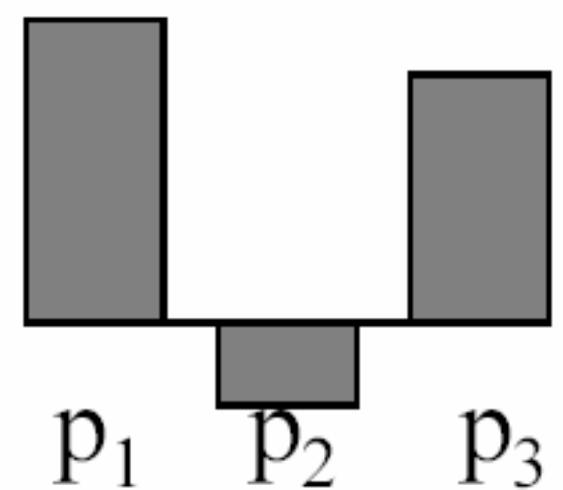
**Example Credit:** Bill Freeman

# Example 2: Color Matching Experiment

We say a “negative” amount of  $P_2$  was needed to make a match , because we added it to the test color side



The primary color amount needed to match:



**Example Credit:** Bill Freeman

# Matching Colours with Displays

Suppose we have a display with lights  $R, G, B$  and we want to match a colour with spectra  $I$  for a person with cone responses  $L, M, S$

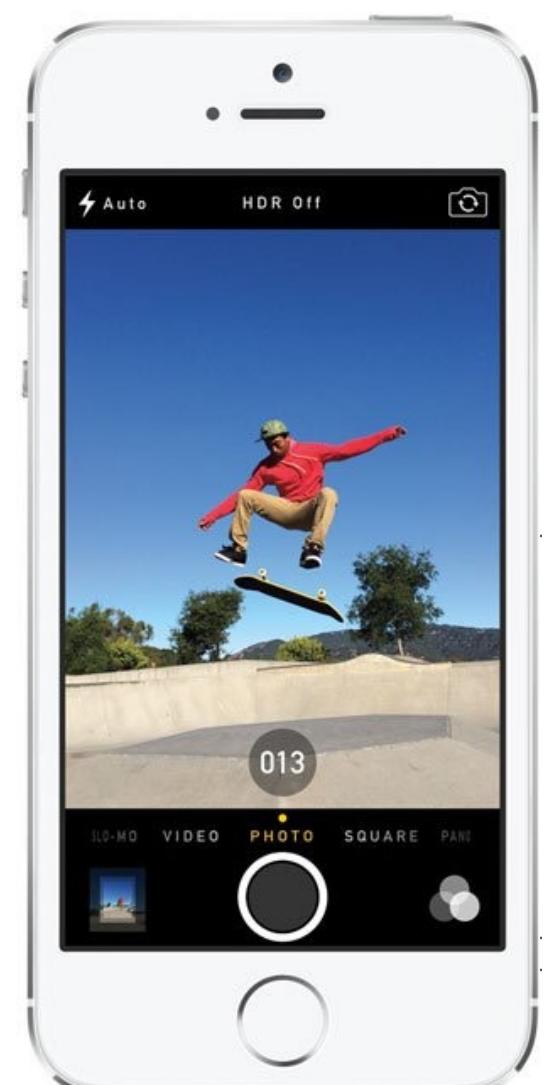
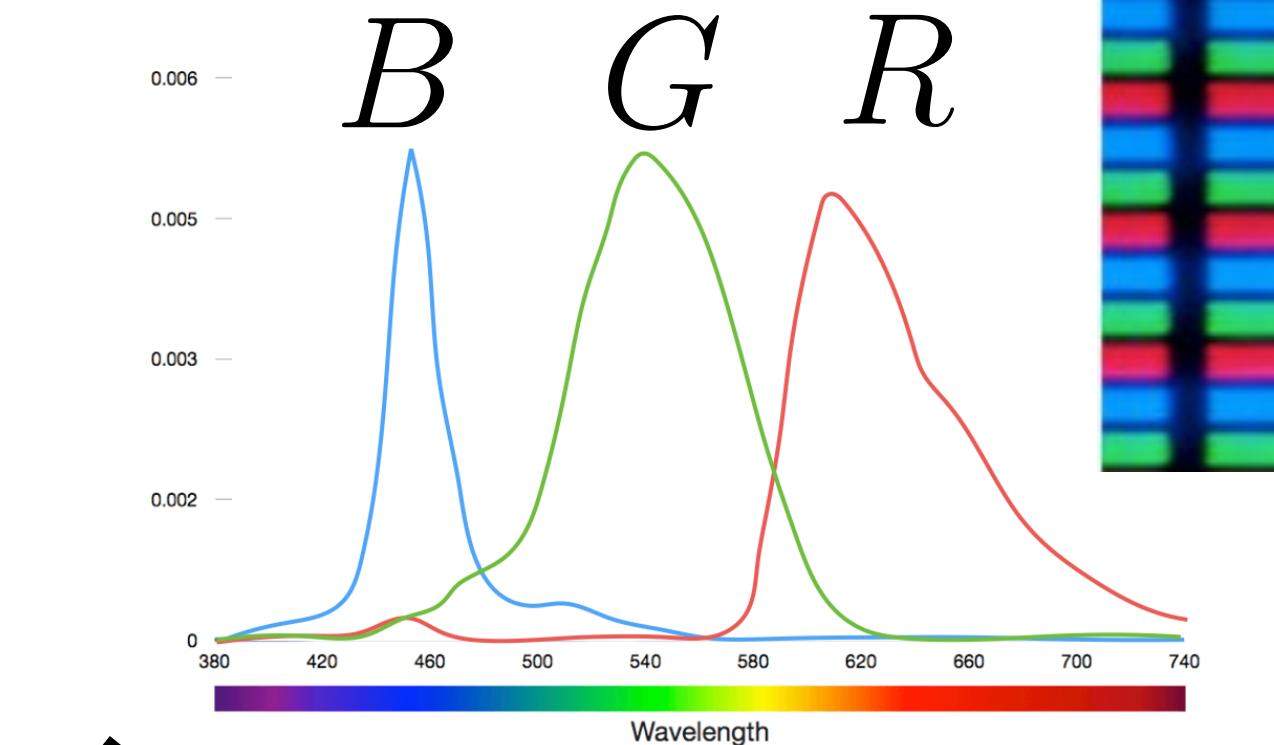
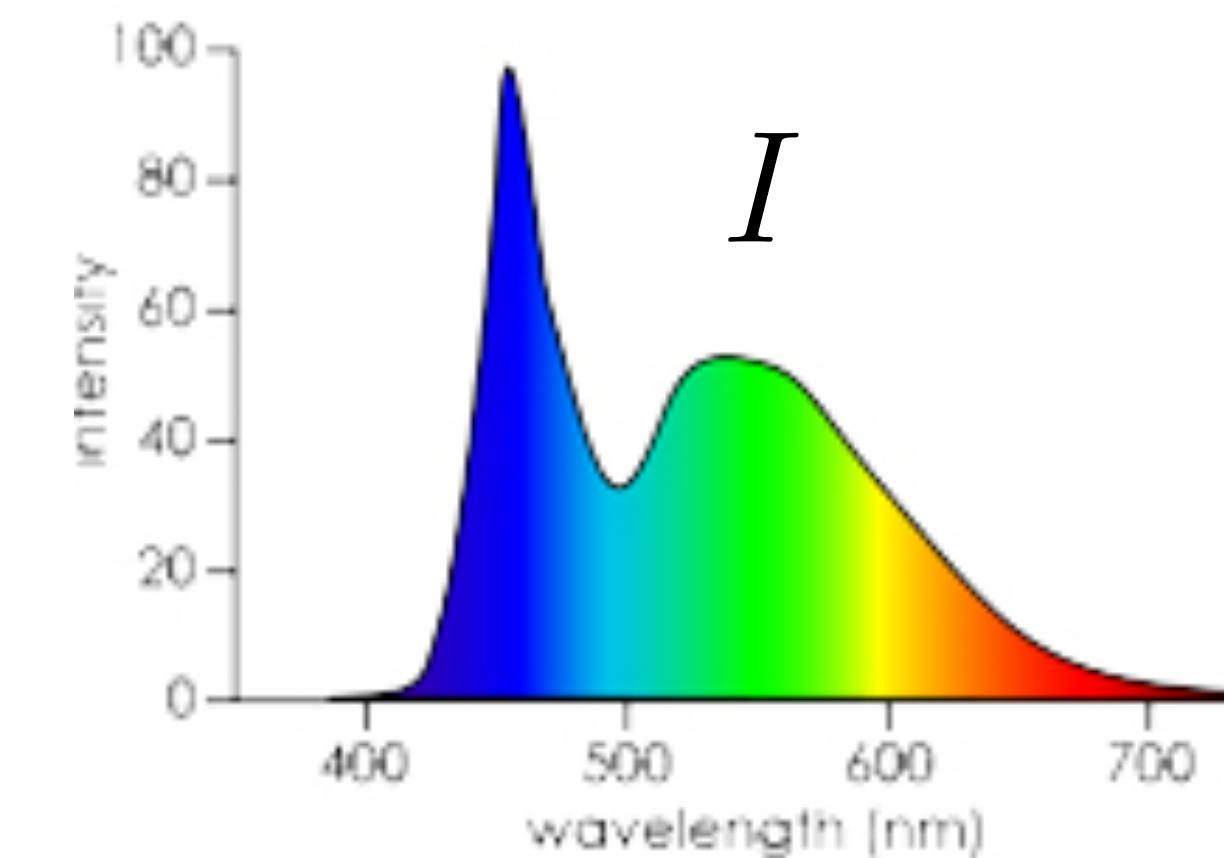
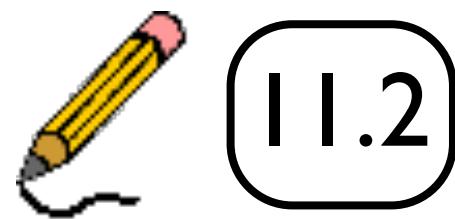
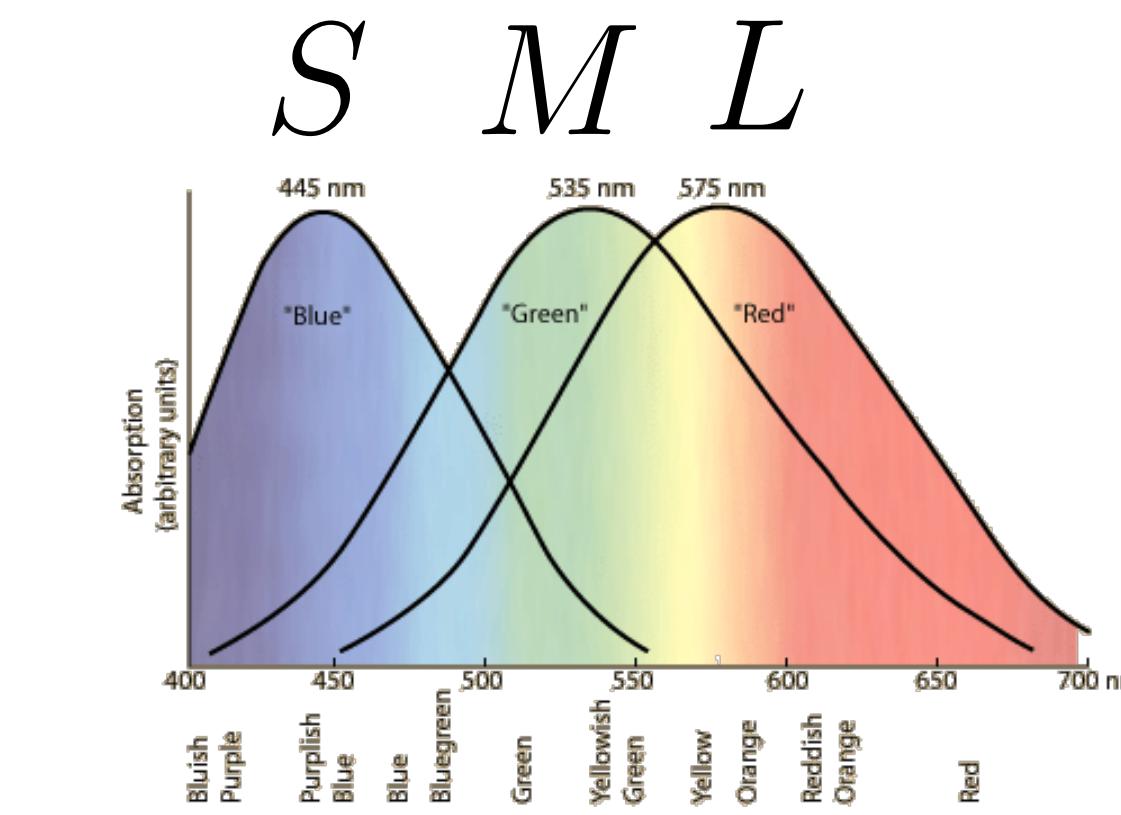
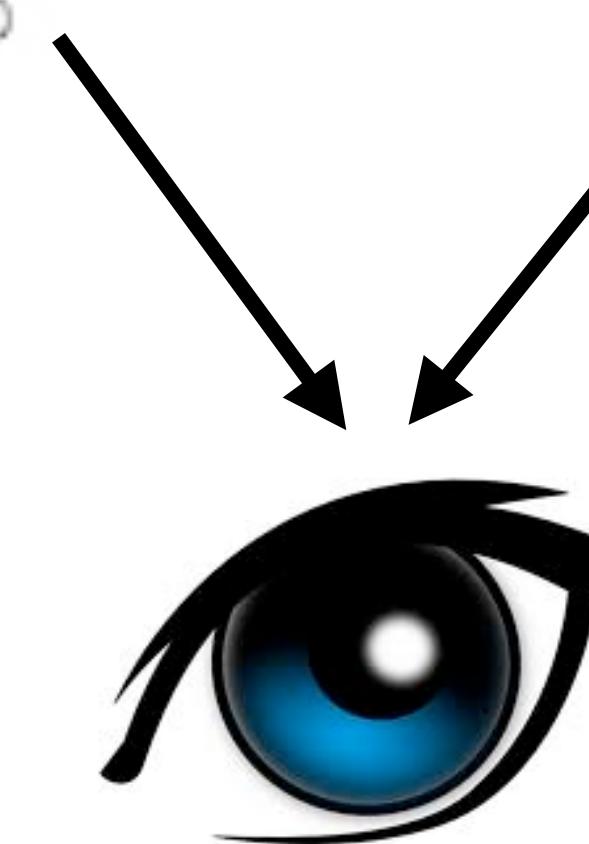
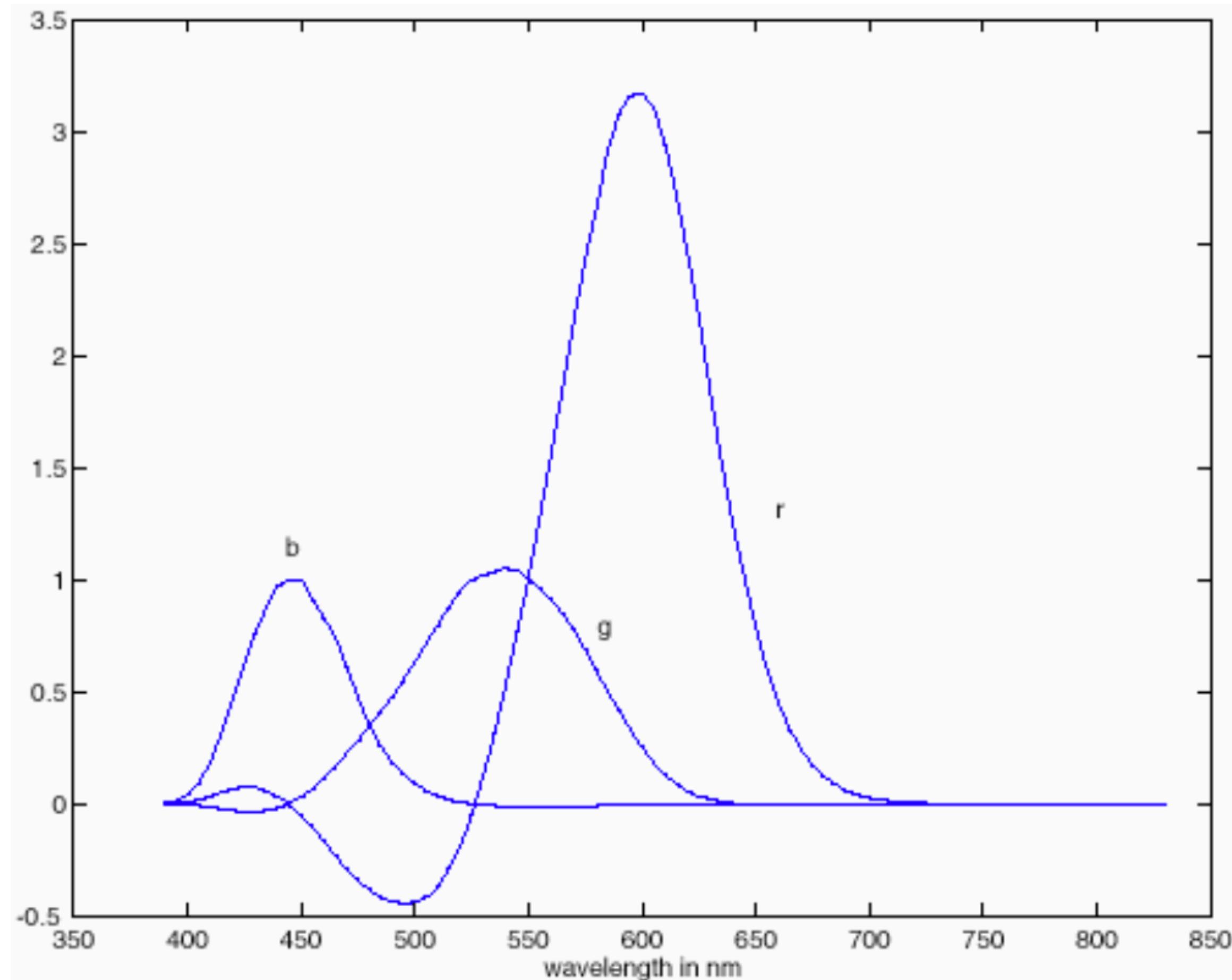


Image and real scene should give the **same cone responses**



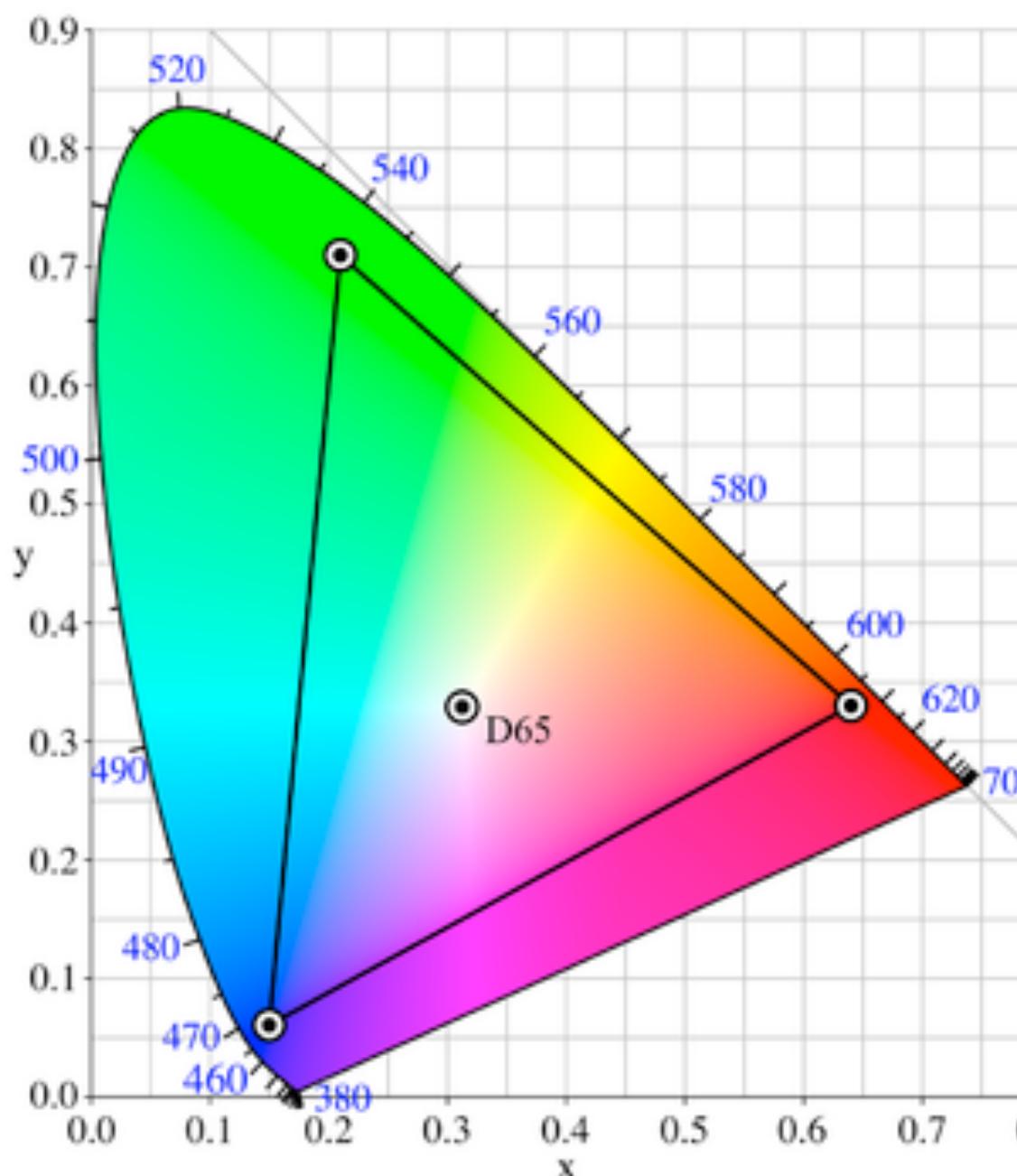
# RGB Colour Matching Functions



- Primaries **monochromatic**
- Wavelengths 645.2, 526.3 and 444.4 nm
- **Negative** parts means some colours can be matched only subtractively

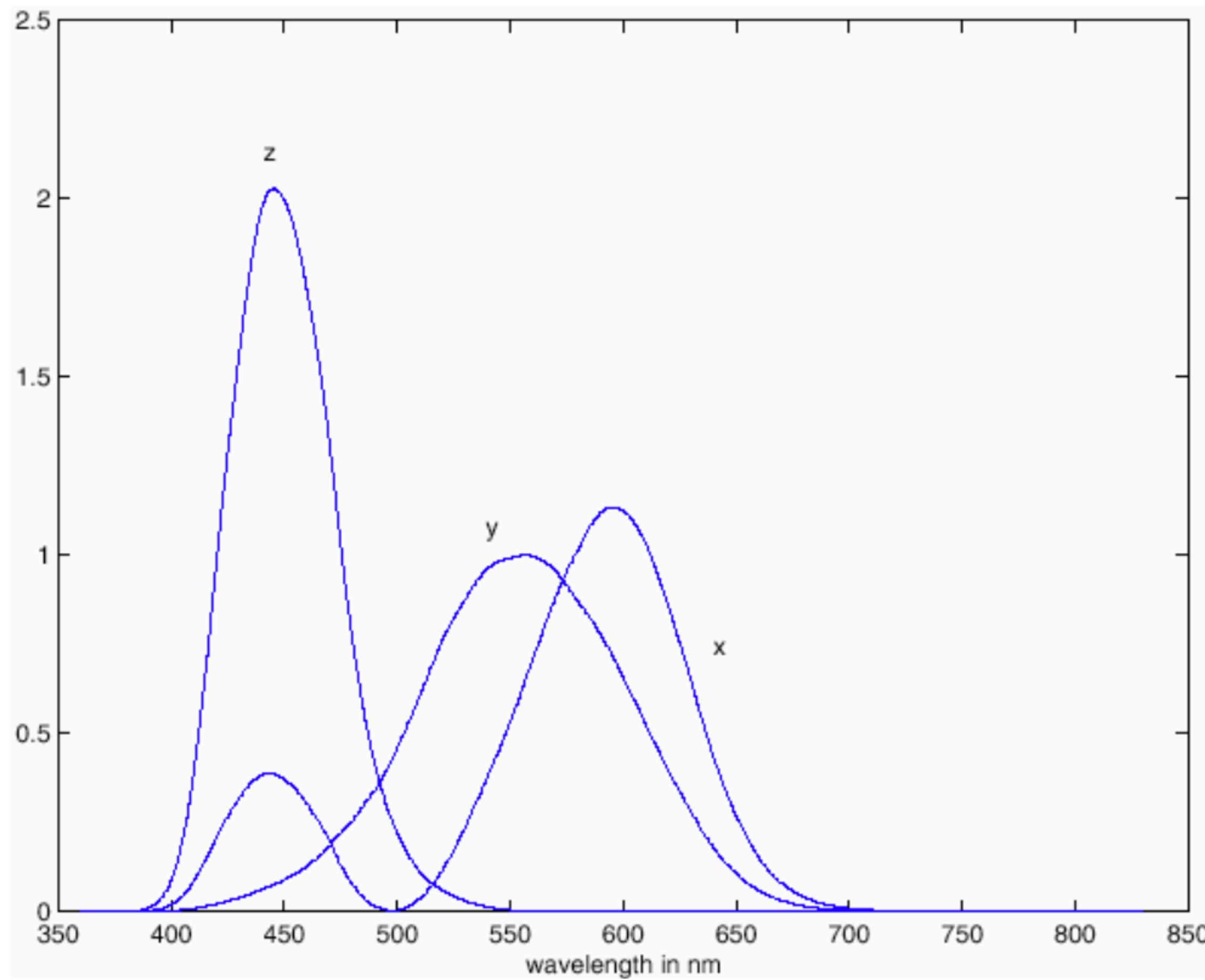
# Cones and Colour Displays

- Humans have trichromatic vision
- So we don't need to generate all possible spectra
  - many different spectra give same perceivable colour (metamers)
- In theory we need just 3 bases to generate all colours
- In practice it is hard to match human cones exactly
- RGB is a pretty good approximation (generates most colours with positive values)



[ Adobe '98  
RGB Gamut ]

# RGB Colour Matching Functions



**CIE XYZ:** Colour matching functions are positive everywhere, but primaries are imaginary. Usually draw  $x$ ,  $y$ , where

$$x = X/(X + Y + Z)$$

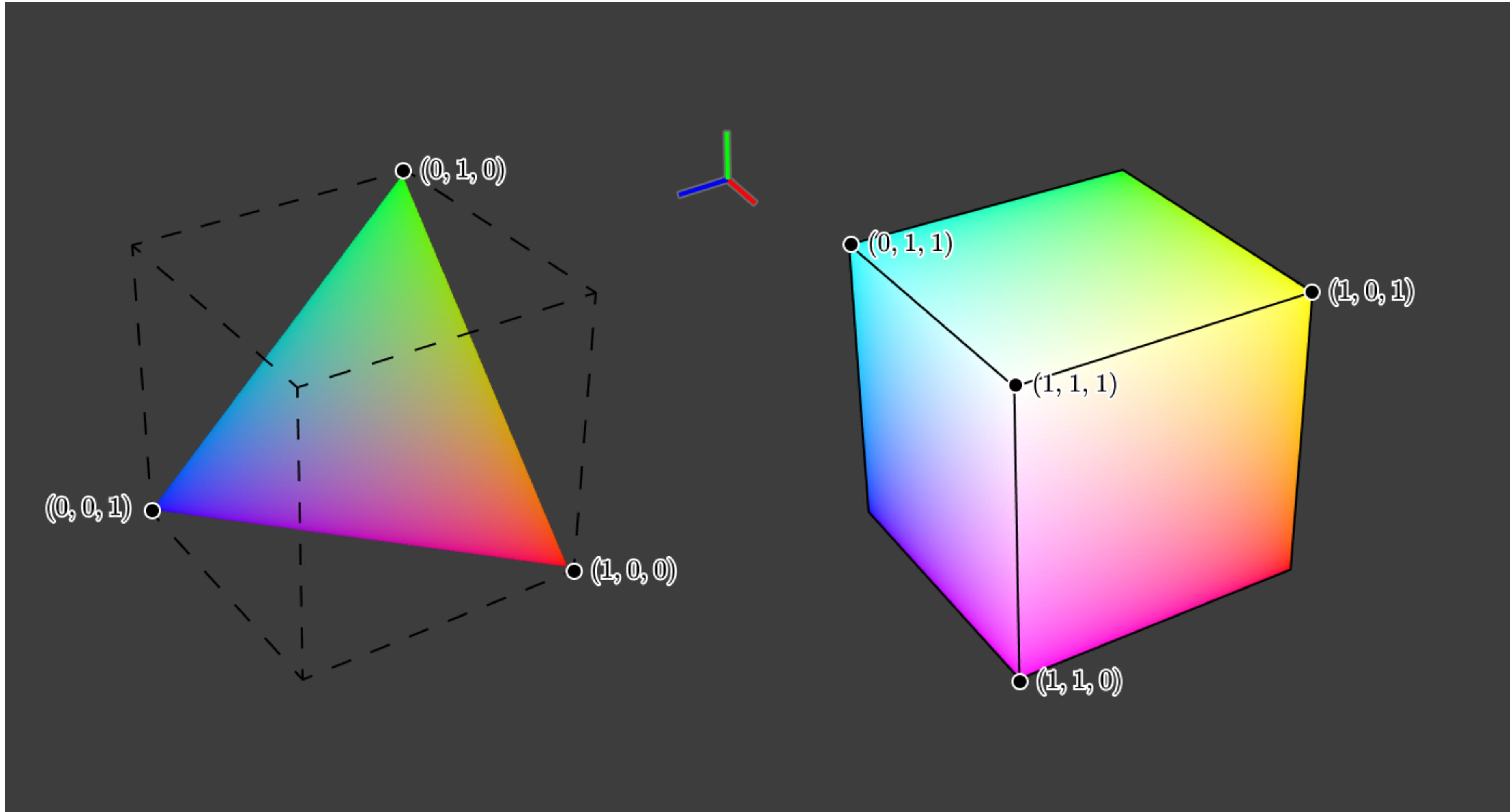
$$y = Y/(X + Y + Z)$$

Overall brightness is ignored

# Color Spaces

- **RGB**: Primaries are monochromatic energies, say 645.2 nm, 526.3 nm, 444.4 nm, standard colour space related to displays
- **CIE XYZ**: Primaries are imaginary, but have other convenient properties. Colour coordinates are ( $X$ ,  $Y$ ,  $Z$ ), where  $X$  is the amount of the  $X$  primary, etc.
- **CIE LAB**: Equal distances in space correspond to perceptually uniform colour differences
- **HSV**: Hue, Saturation, Value a useful colour space for artists and **colour selection** applications
- **YCbCr**: Separates **luminance** ( $Y$ ) and **opponent colours** ( $CbCr$ ), useful for compression and transmission

# RGB Color Space

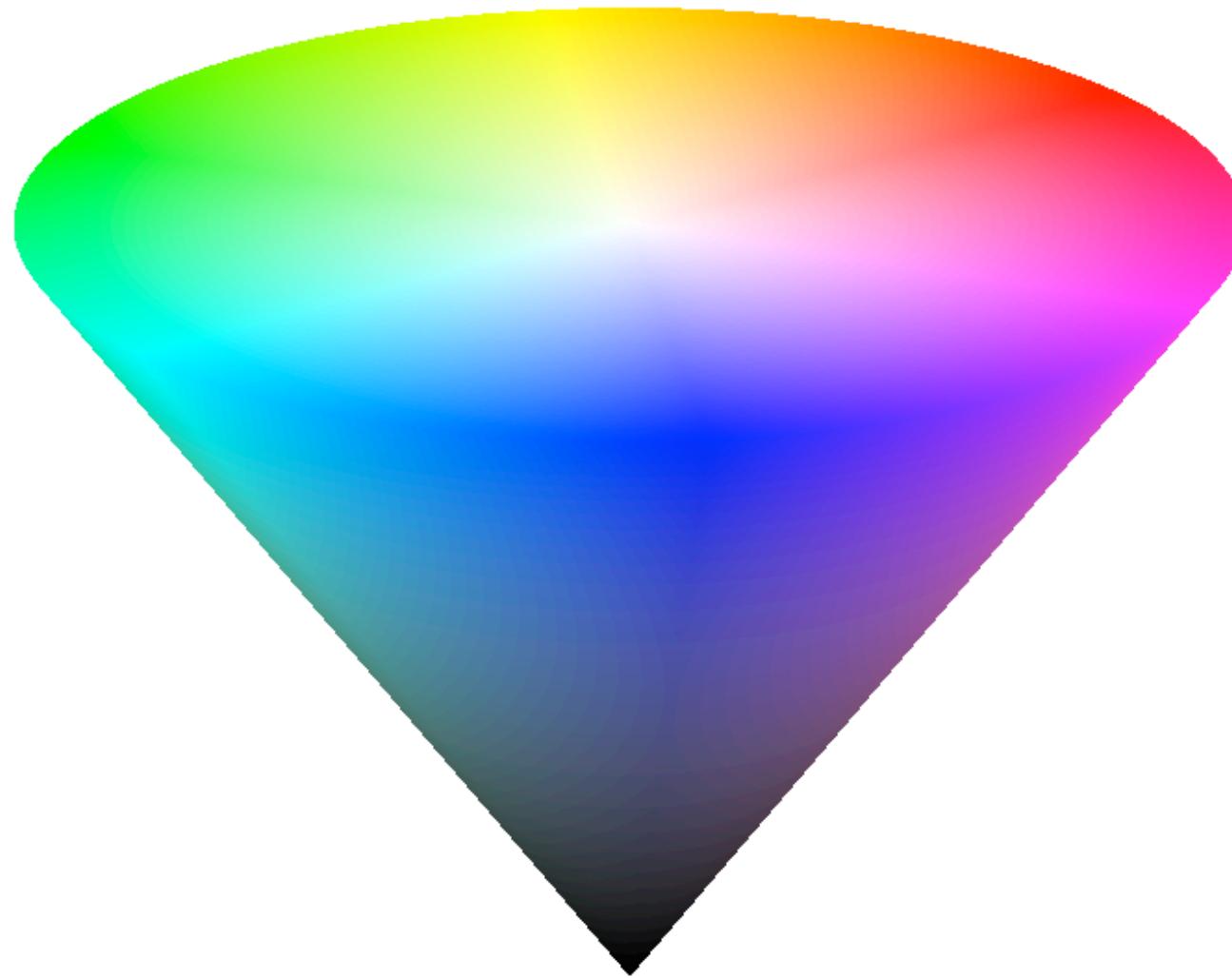


# HSV Colour Space

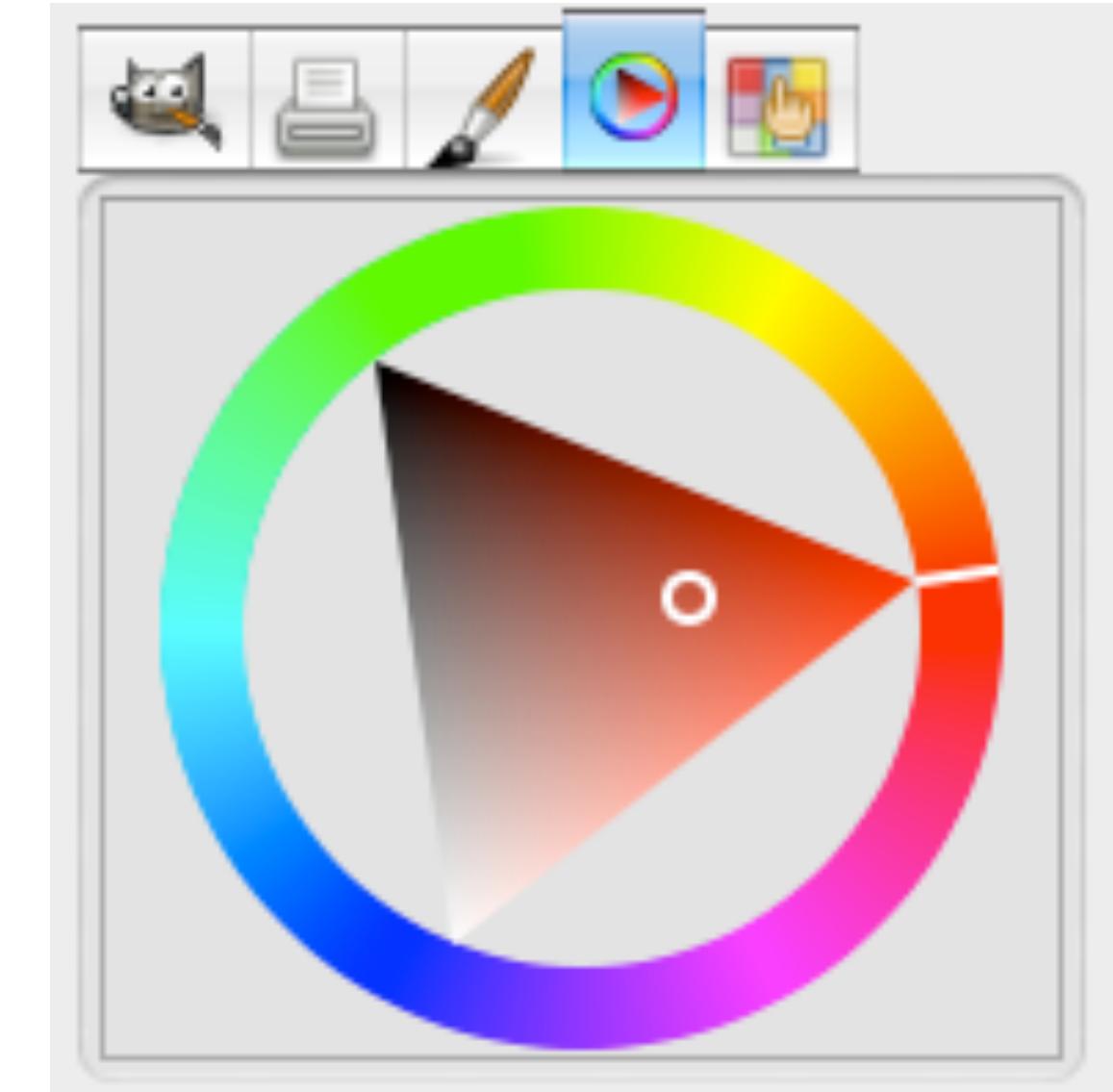
- Often used for colour selection in applications



RGB Cube



HSV Cone



HSV Colour  
Wheel

# HSV Colour Space

More natural description of colour for human interpretation

**Hue:** attribute that describes a pure colour

- e.g. 'red', 'blue'

**Saturation:** measure of the degree to which a pure colour is diluted by white light

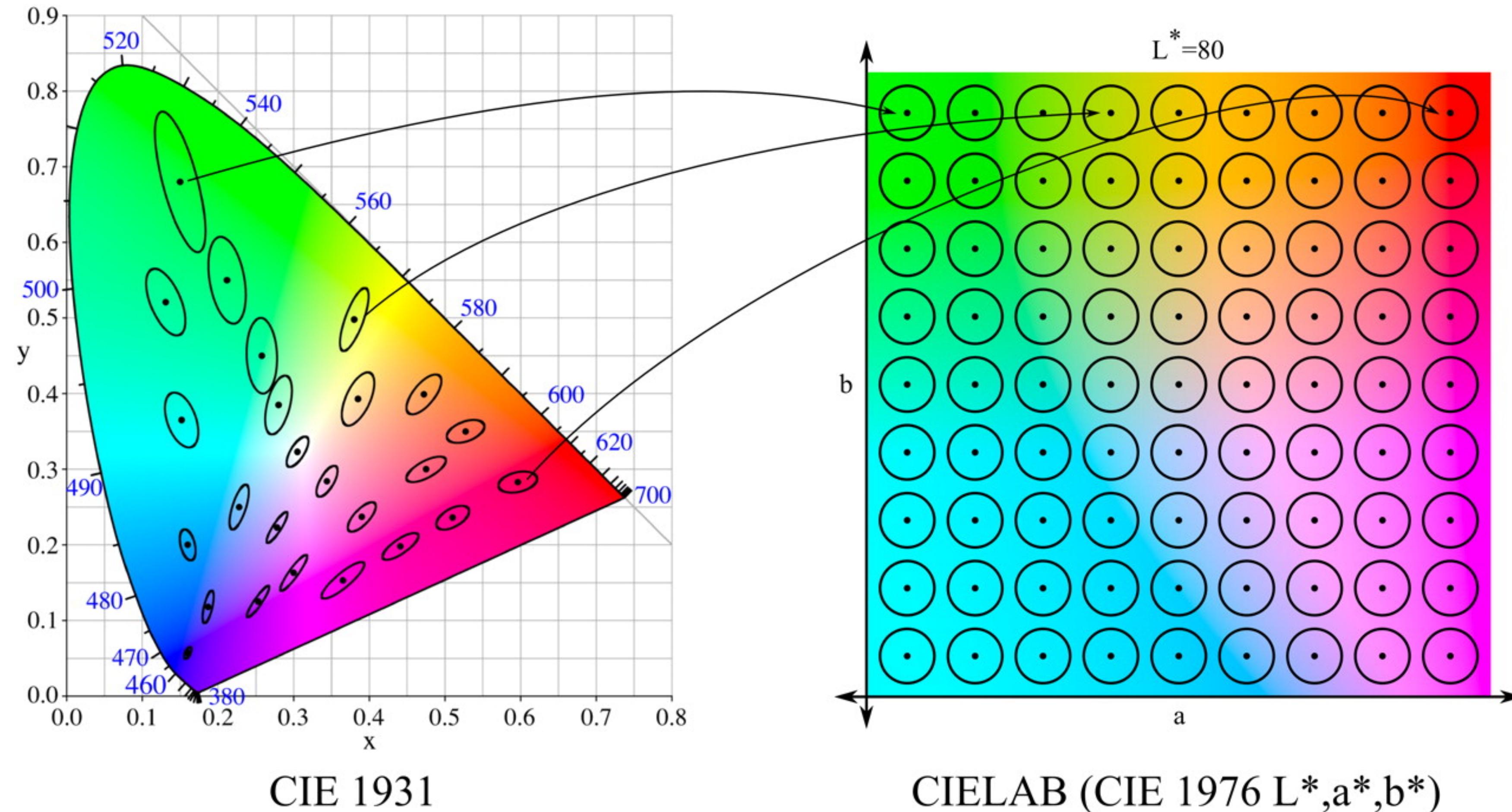
- pure spectrum colours are fully saturated

**Value:** intensity or brightness

Hue + saturation also referred to as **chromaticity**.

# Uniform Colour Space CIE-LAB

McAdam Ellipses: Each ellipse shows colours perceived to be the same



From Henrich et al. 2011

<https://iovs.arvojournals.org/article.aspx?articleid=2187751>

# YCbCr = Colour for Image Coding

- Separates luminance (Y) from chrominance (Cb, Cr)
- Chrominance can be compressed more (e.g. 1/2 size in JPG)



$$Y' = 16 + 65.5R' + 128.6G' + 25.0B'$$

$$Cb = 128 - 37.8R' - 74.2G' + 112B'$$

$$Cr = 128 + 112.0R' - 93.8G' - 18.2B'$$

- Linear transform of RGB
- Primes = gamma correction

YCbCr is used for image and video coding. Human vision uses a similar transform (opponent colours) and we have more rods than cones

# Summary

- Human colour **perception**
  - principle of trichromacy
  - colour matching experiments
- Colour **reproduction**
  - match cone responses
  - colour matching functions
- Colour **spaces**
  - multiple objectives: art/design orientation, perceptually uniform, image coding etc.

# Menu for Today

## Topics:

- Colour, **Trichromacy**
- **Colour Matching** Experiments
- **Colour Spaces**
- **Final** examples

## Readings:

- **Today's** Lecture: Szeliski 2.3.2, Forsyth & Ponce 3.1-3.3

## Reminders:

- **Assignment 6** due Dec 7th
- **Final** is Dec 14th (**2hrs**, closed book, no calculators)
- Today is the **last lecture!** No lectures next week