

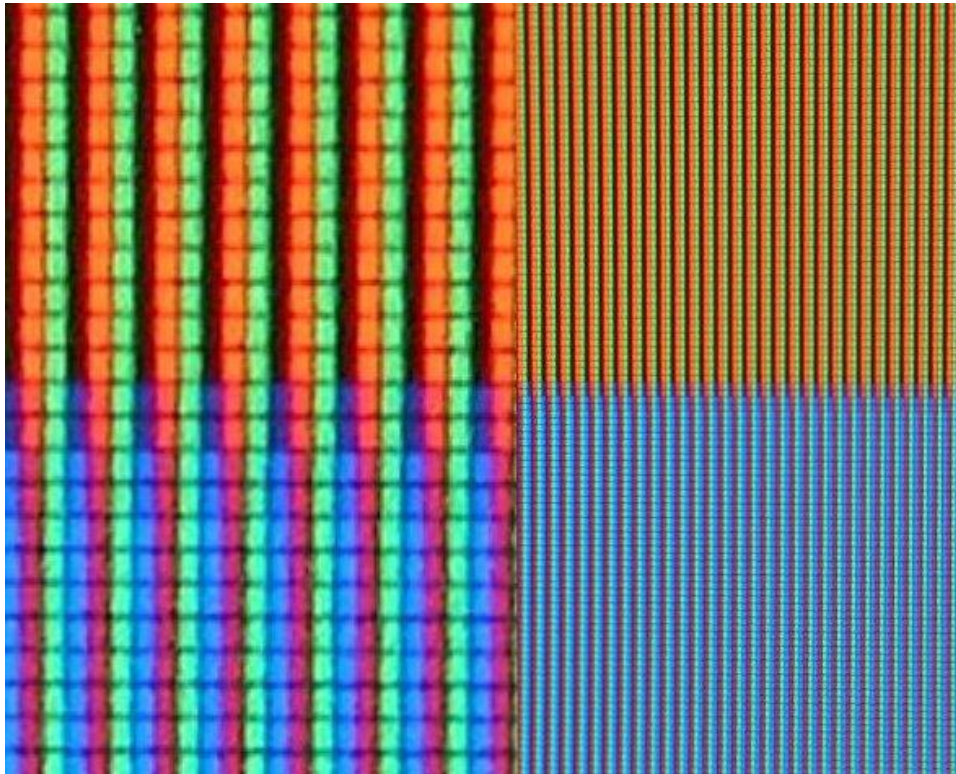
# Computergrafik

Matthias Zwicker  
Universität Bern  
Herbst 2016

# Today

## Color

- What is the relation between RGB values sent to a monitor and the colors we see?



RGB subpixels  
of LCD displays

# Today

## Color

- **Physics background**
- Color perception
- Color spaces
- Color reproduction on monitors
- Perceptually uniform color spaces

# Light: physical models

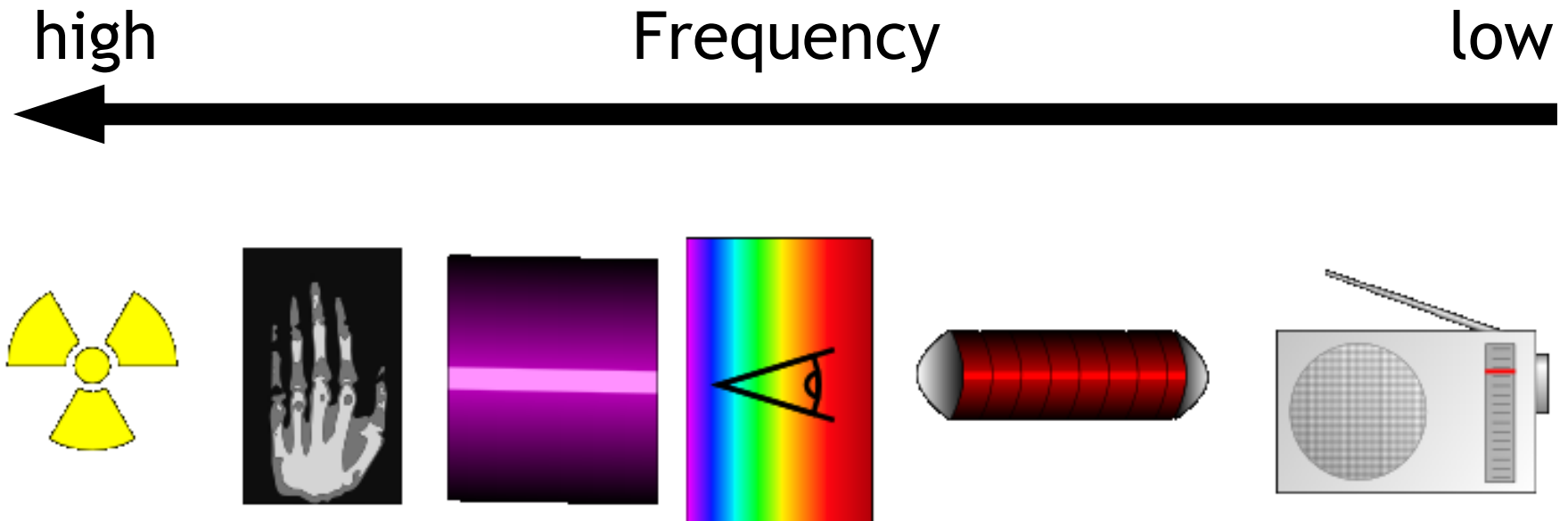
- Corpuscular theory (particles) [Newton ~1700]
- Wave theory [Huygens ~1700; Young 1801]
- Electromagnetic waves [Maxwell 1862]
- Photons (tiny particles) [Planck 1900]
- Wave-particle duality [Einstein, early 1900]  
“It depends on the experiment you are doing whether light behaves as particles or waves”
- Simplified models in computer graphics

# Electromagnetic waves

- Different frequencies

[http://en.wikipedia.org/wiki/Electromagnetic\\_radiation](http://en.wikipedia.org/wiki/Electromagnetic_radiation)

[http://en.wikipedia.org/wiki/Electromagnetic\\_spectrum](http://en.wikipedia.org/wiki/Electromagnetic_spectrum)



# Electromagnetic waves

- Different frequencies

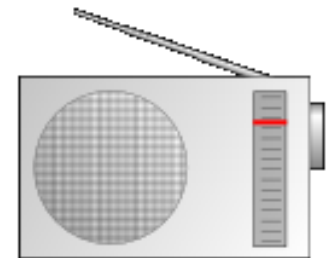
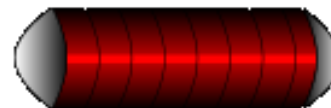
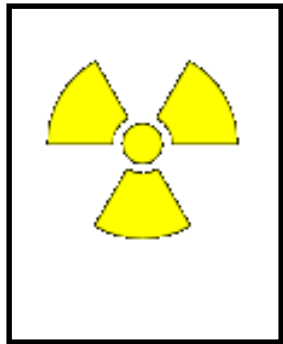
[http://en.wikipedia.org/wiki/Electromagnetic\\_radiation](http://en.wikipedia.org/wiki/Electromagnetic_radiation)

[http://en.wikipedia.org/wiki/Electromagnetic\\_spectrum](http://en.wikipedia.org/wiki/Electromagnetic_spectrum)

high

Frequency

low



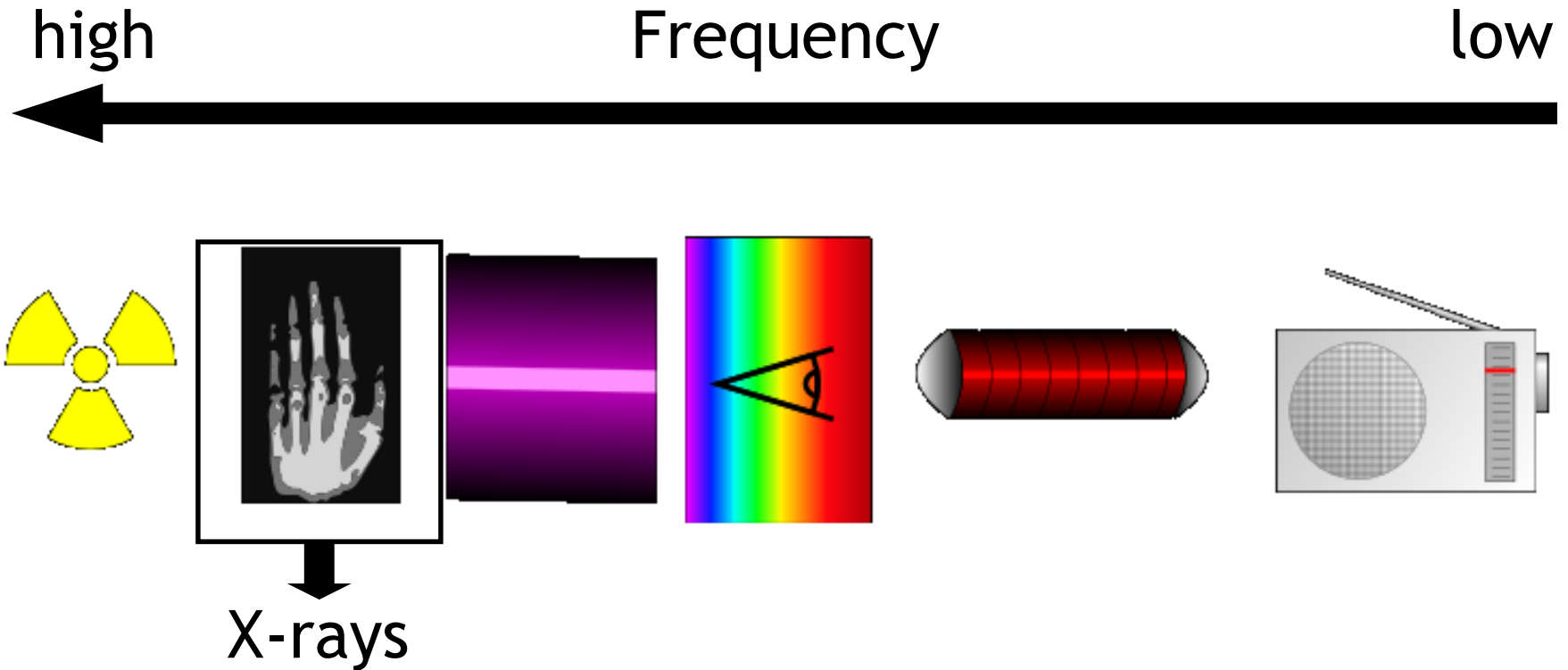
Gamma rays,  
nuclear radiation

# Electromagnetic waves

- Different frequencies

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[http://en.wikipedia.org/wiki/Electromagnetic\\_spectrum](http://en.wikipedia.org/wiki/Electromagnetic_spectrum)

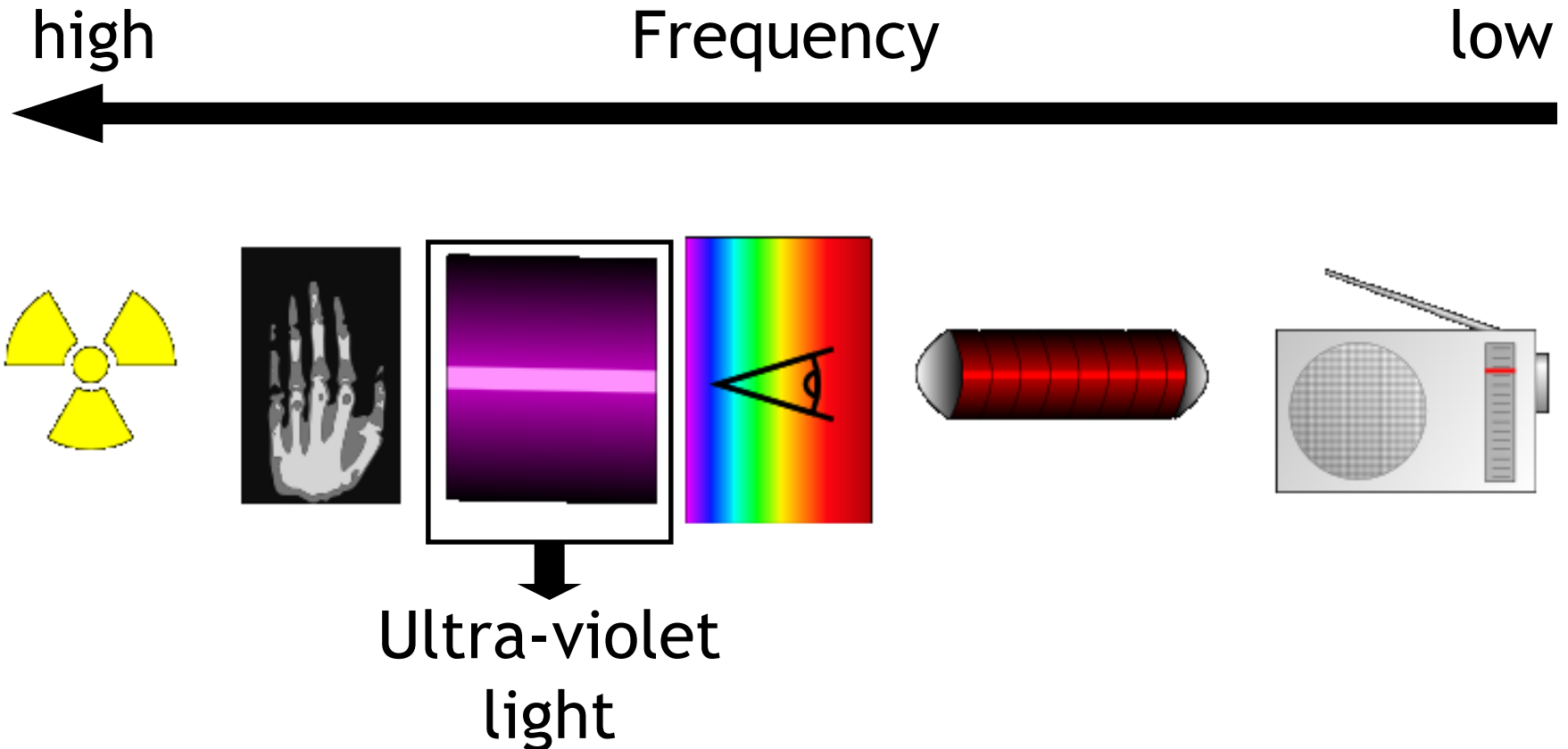


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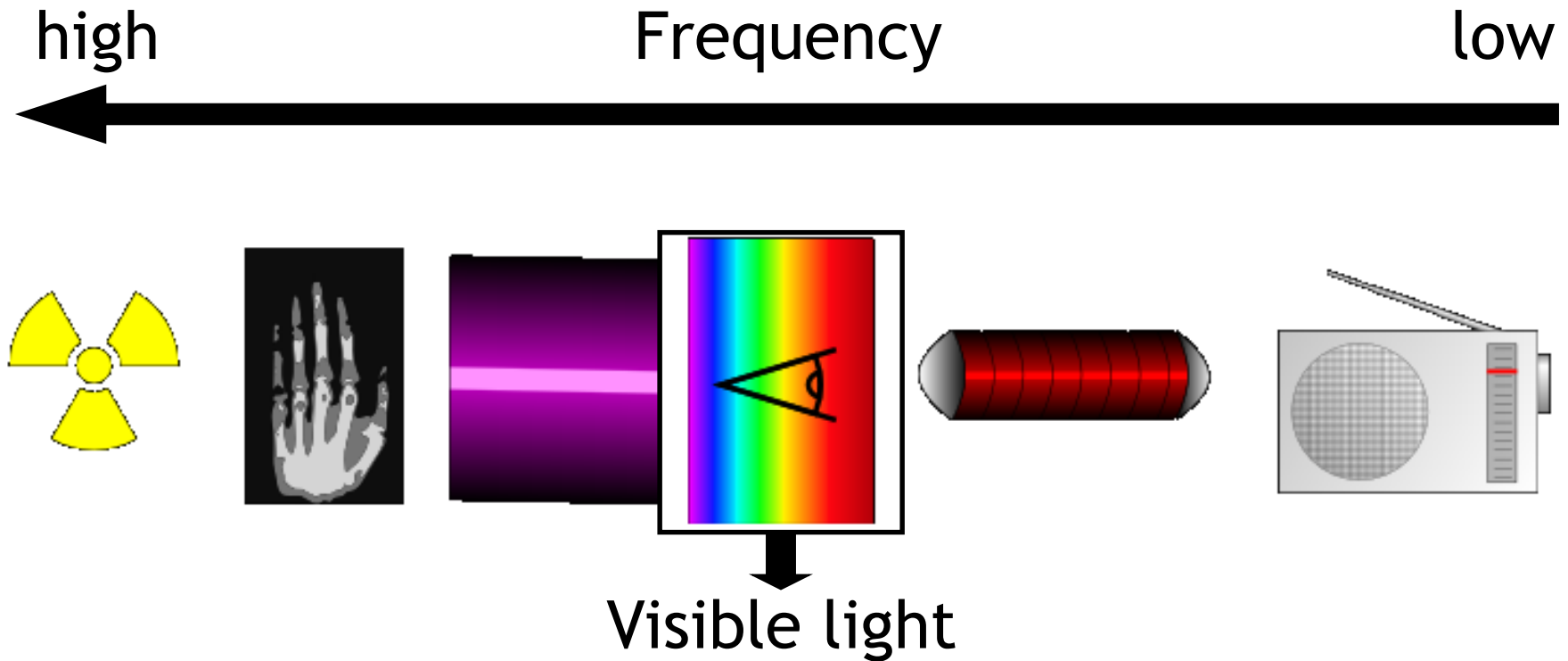


# Electromagnetic waves

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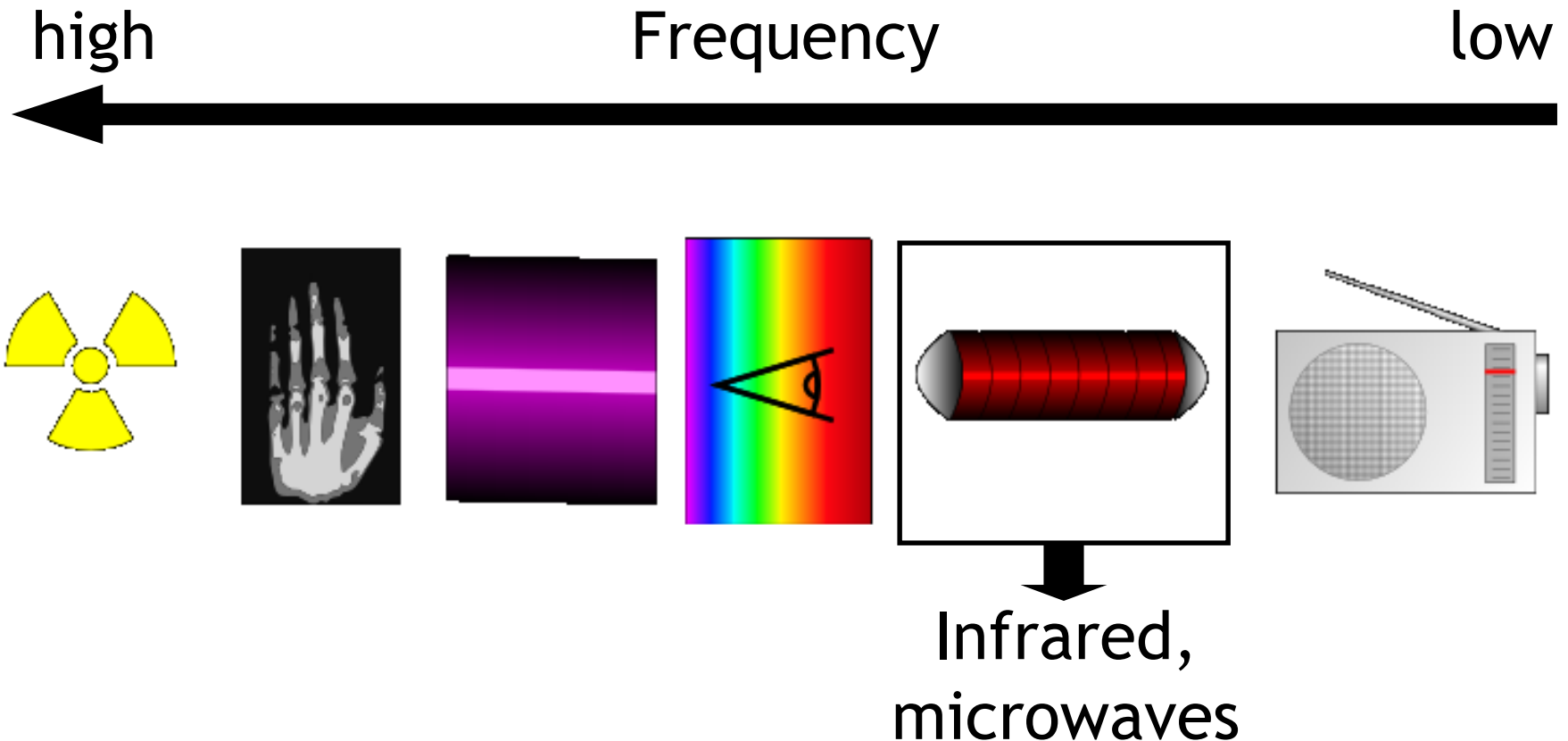


# Electromagnetic waves

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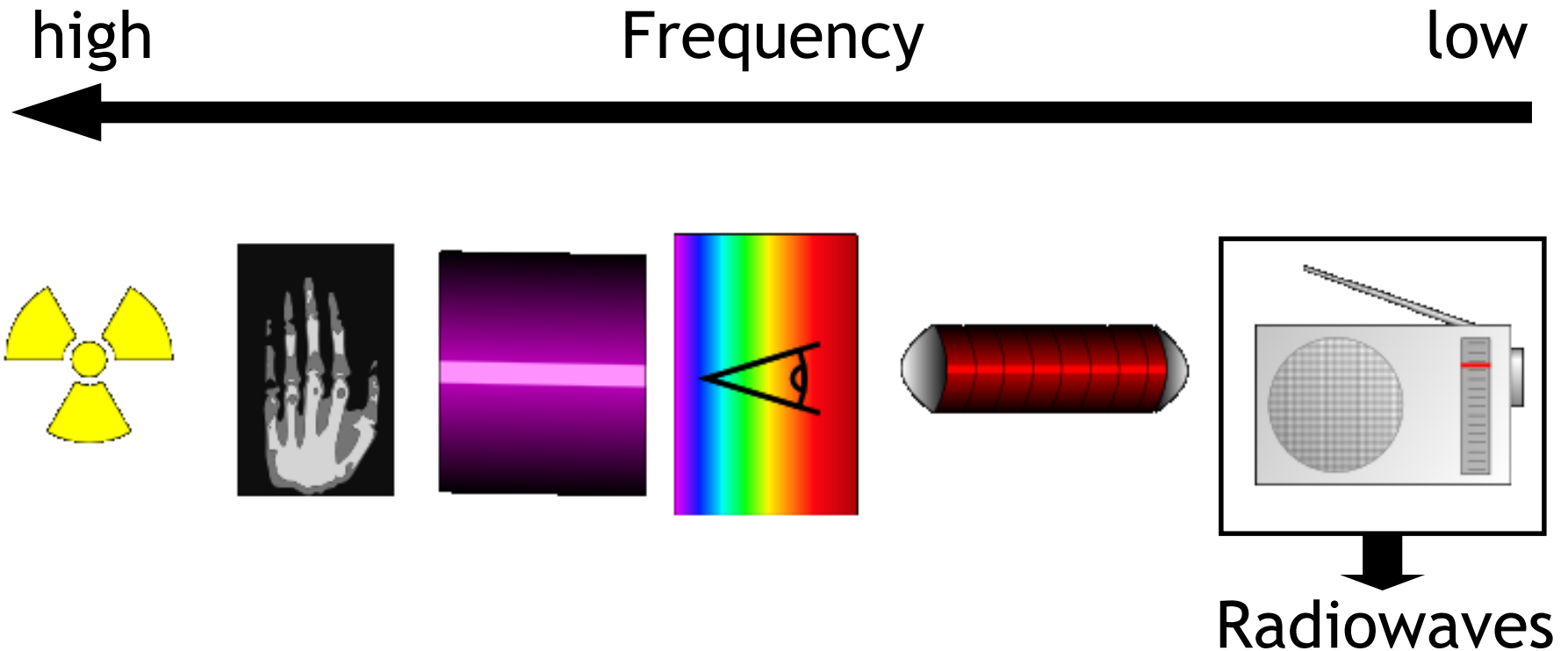


# Electromagnetic waves

- Different frequencies

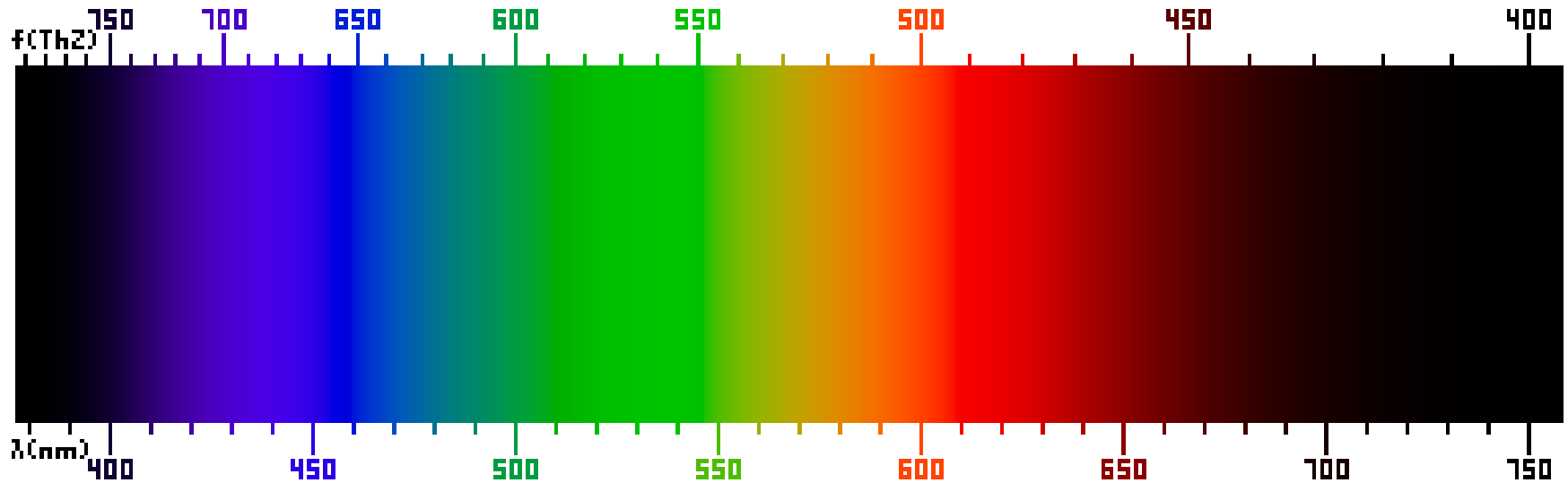
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# Visible light

Frequency



Wavelength

$1\text{nm}=10^{-9}$  meters,  
one-billionth of a meter

speed of light = wavelength \* frequency

# Light transport: Geometrical optics

- Simplified model

[http://en.wikipedia.org/wiki/Geometrical\\_optics](http://en.wikipedia.org/wiki/Geometrical_optics)

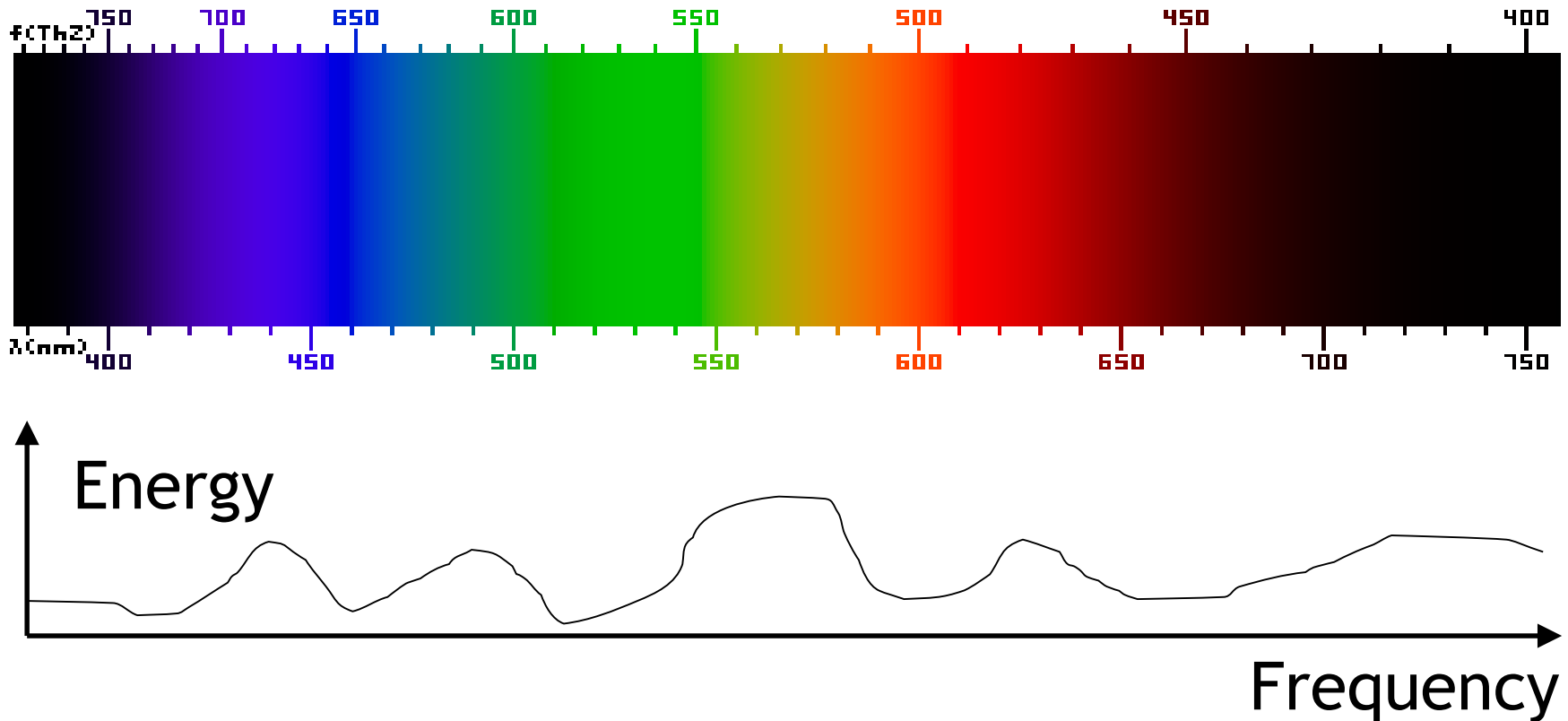
- Roughly speaking

- Light is transported along **straight rays**
- When light interacts with material, it may be reflected or refracted

- Can model most light transport effects that are important for our daily experience

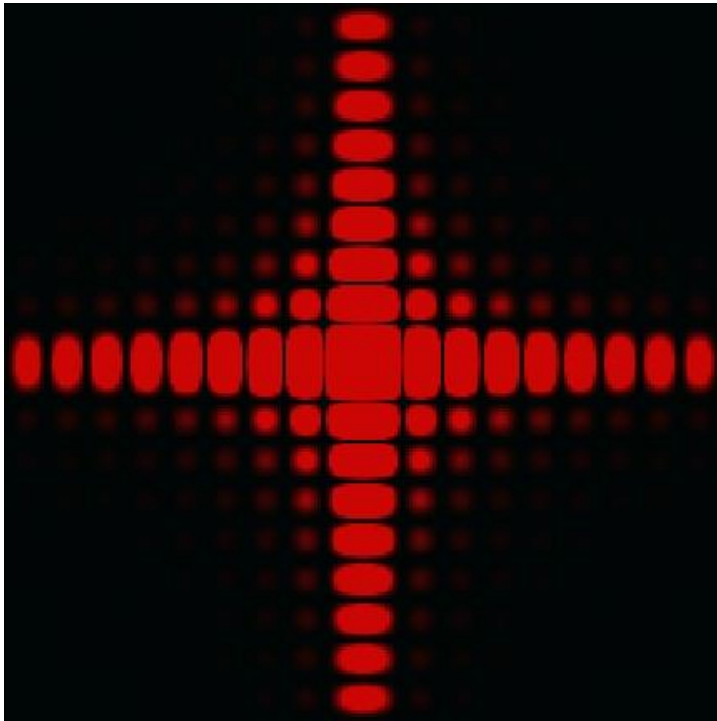
# Light transport: Geometrical optics

- Rays carry a spectrum of electromagnetic energy
  - An “energy spectrum”, energy per wavelength



# Limitations

- „Wave nature“ of light ignored
- E.g., no diffraction effects



Diffraction pattern of a small square aperture



Surface of a DVD forms a diffraction grating

# Today

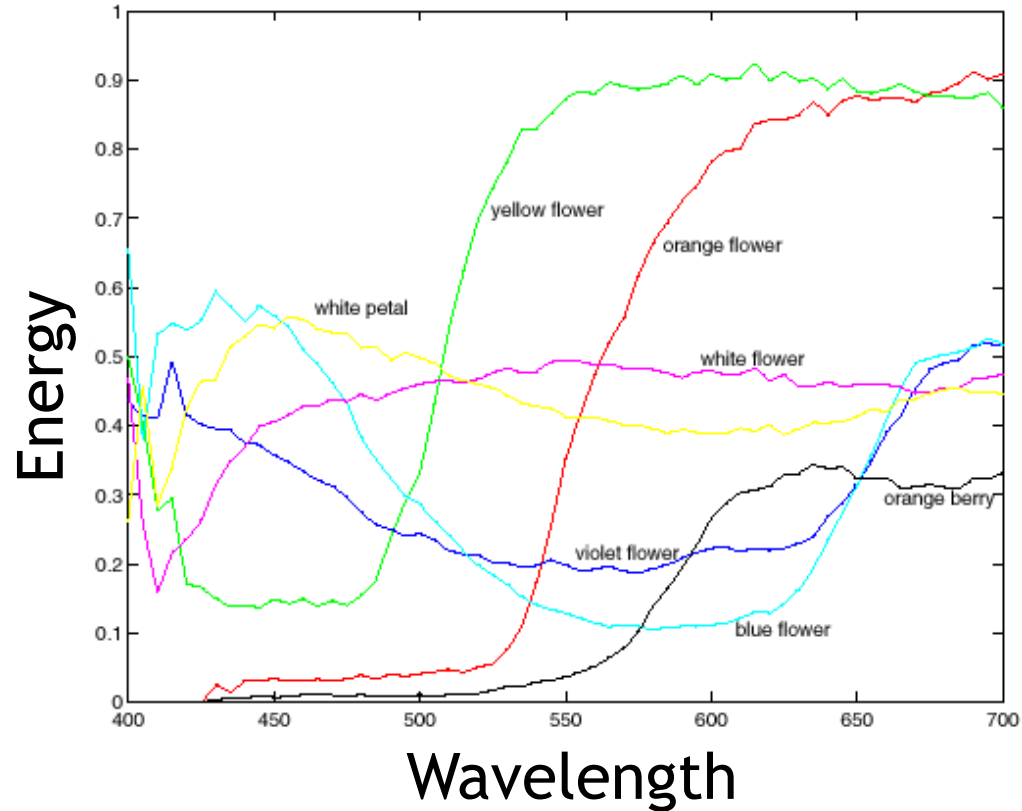
## Color

- Physics background
- Color perception
- Color spaces
- Color reproduction on monitors
- Perceptually uniform color spaces



# Light and color

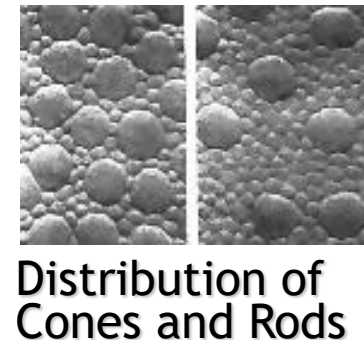
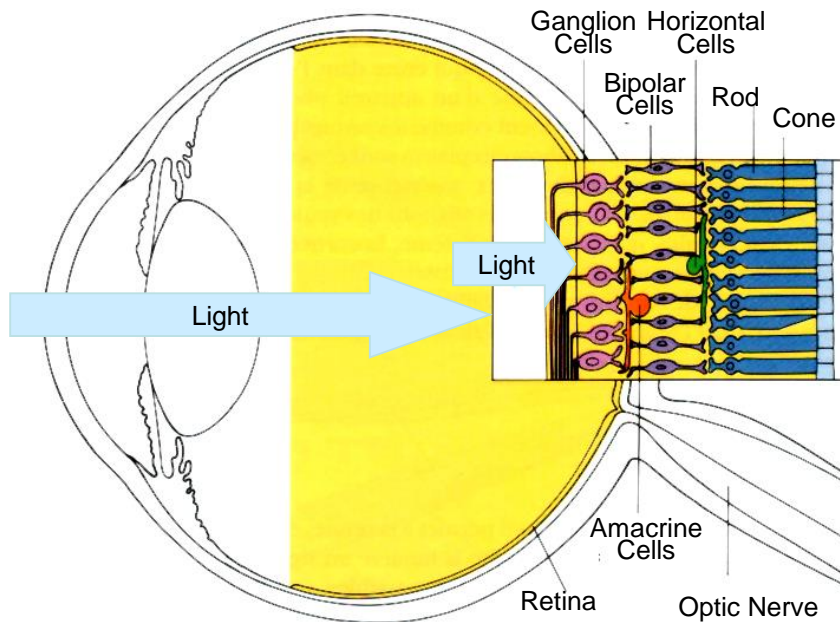
Measured energy spectra



- How do humans perceive/measure such energy spectra?
- Can we distinguish any two different spectra?

# Color perception

- Photoreceptor cells  
[http://en.wikipedia.org/wiki/Photoreceptor\\_cell](http://en.wikipedia.org/wiki/Photoreceptor_cell)
- Light sensitive
- Two types, rods and cones



# Photoreceptor cells

## Rods

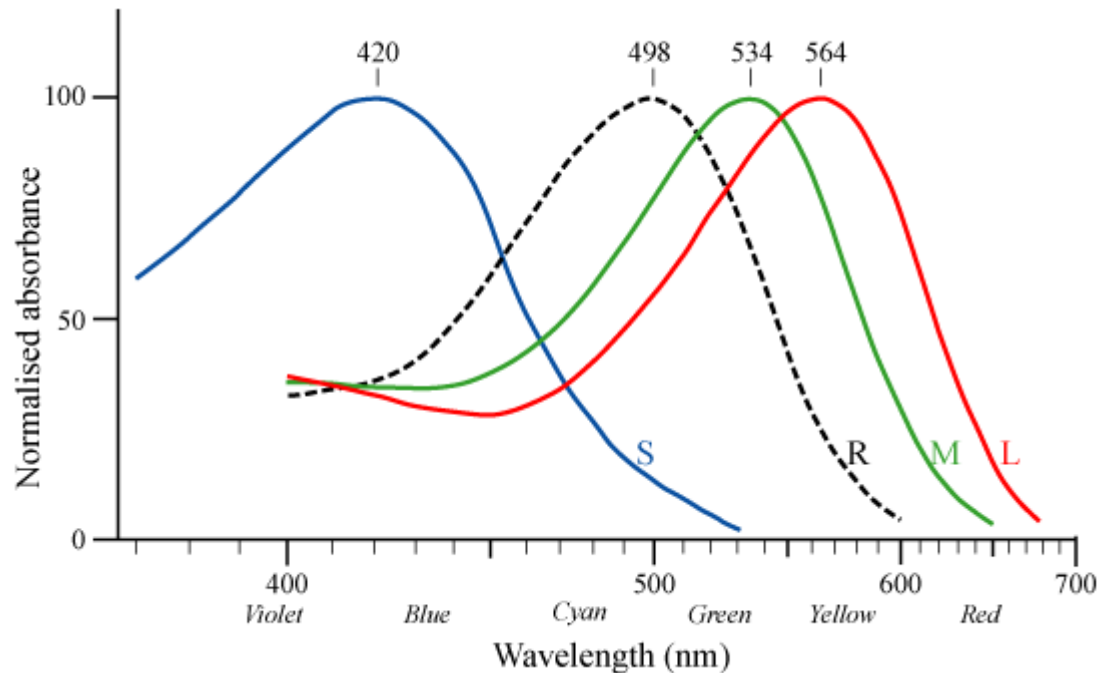
- About 100 times more sensitive than cones
- Low light vision
- Not involved in color perception

## Cones

- 3 types of cones: S,M,L
- Sensitive to different wavelengths (short, medium, long)

# Photoreceptor cells

- Absorbance: fraction of light absorbed at each wavelength
- Absorbance curves S, M, L for SML cone pigments



[http://en.wikipedia.org/wiki/Photoreceptor\\_cell](http://en.wikipedia.org/wiki/Photoreceptor_cell)

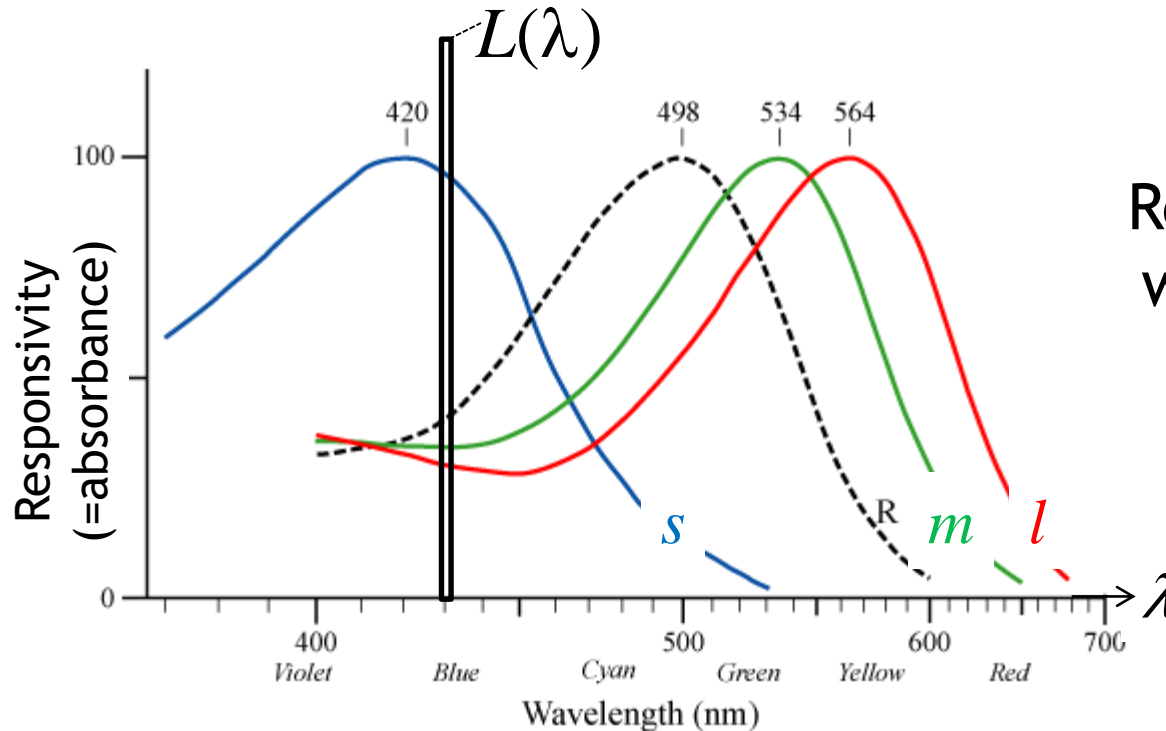
- Experimentally determined in the 1980s  
<http://www.pubmedcentral.nih.gov/articlerender.fcgi?artid=1279132>

# Response to arbitrary spectrum

- Response
  - Neural signal emitted by cell upon stimulus
  - “How strongly the cell reacts to a stimulus”
- **Simplified model** for response of cone receptors to given spectrum (stimulus), derived using two assumptions
  1. SML **absorbance** at each wavelength = **responsivity** (input-output gain) at that wavelength  
<http://en.wikipedia.org/wiki/Responsivity>
  2. Grassmann’s law: linearity  
[http://en.wikipedia.org/wiki/Grassmann's\\_law\\_\(optics\)](http://en.wikipedia.org/wiki/Grassmann's_law_(optics))

# 1. Responsivity = absorbance

- Assume stimulus  $L(\lambda)$  is spectral color („peak“) at wavelength  $\lambda$ , [http://en.wikipedia.org/wiki/Spectral\\_color](http://en.wikipedia.org/wiki/Spectral_color)



Responsivity at each wavelength defines  
**response curves**  
 $s(\lambda)$ ,  $m(\lambda)$ ,  $l(\lambda)$

- SML responses

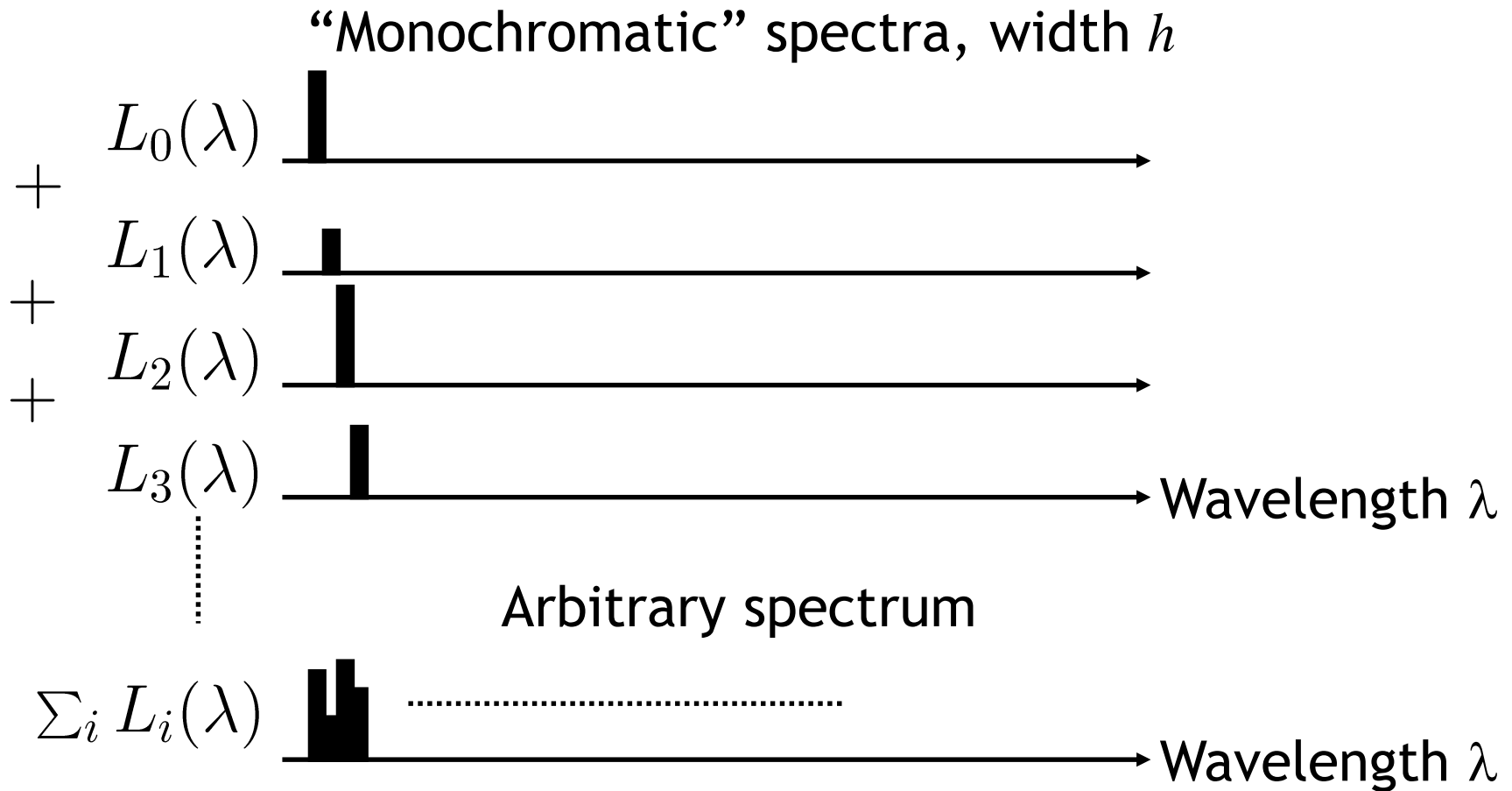
$$\text{response}_s(L(\lambda)) = s(\lambda)L(\lambda)$$

$$\text{response}_m(L(\lambda)) = m(\lambda)L(\lambda)$$

$$\text{response}_l(L(\lambda)) = l(\lambda)L(\lambda)$$

## 2. Linearity

- Arbitrary spectrum as sum of “monochromatic peaks”



## 2. Linearity

- Grassman's law (linearity): Response to sum of spectra is equal to sum of responses to each spectrum

$$\text{response} \left( \sum_i L_i(\lambda) \right) = \sum_i \text{response} (L_i(\lambda))$$

- Remember: if  $L_i(\lambda)$  is a monochromatic peak at wavelength  $\lambda_i$ , then

$$\text{response}_s (L_i(\lambda)) = s(\lambda_i) L_i(\lambda_i)$$

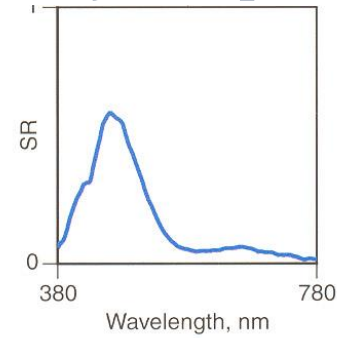
- In the limit (infinitely many peaks)

$$\text{response}_s \left( \sum_i^\infty L_i(\lambda_i) \right) = \sum_i^\infty s(\lambda_i) L_i(\lambda_i) = \int s(\lambda) L(\lambda) d\lambda$$

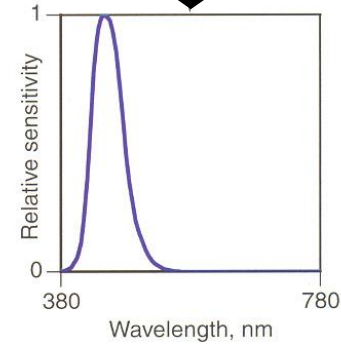
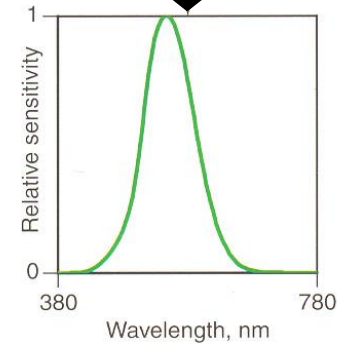
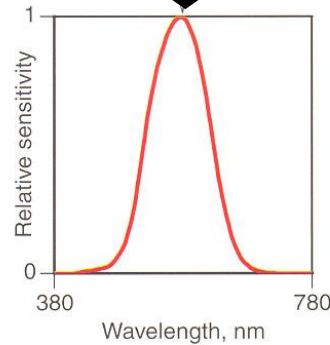


# Response to arbitrary spectrum

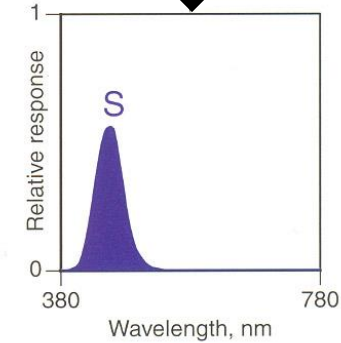
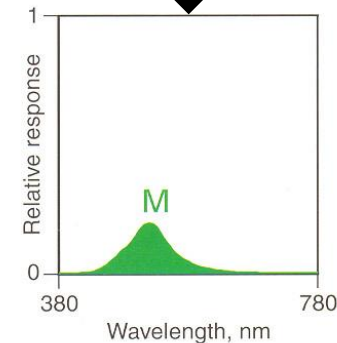
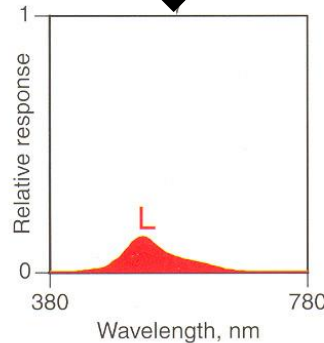
Stimulus  
(arbitrary spectrum)



Response curves



Multiply



Integrate

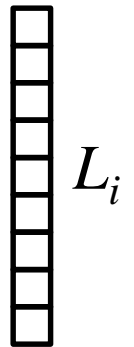
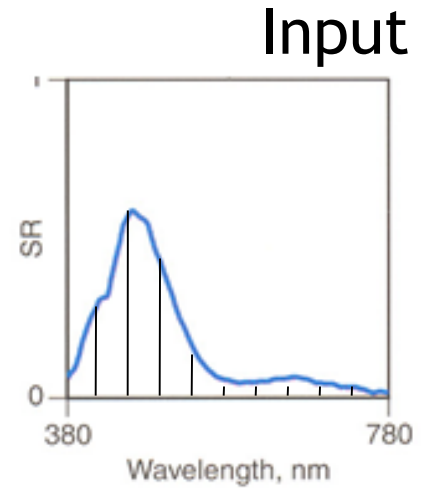
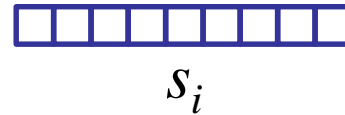
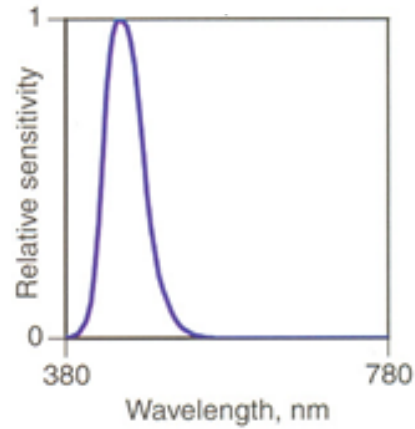
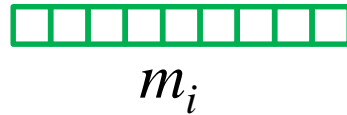
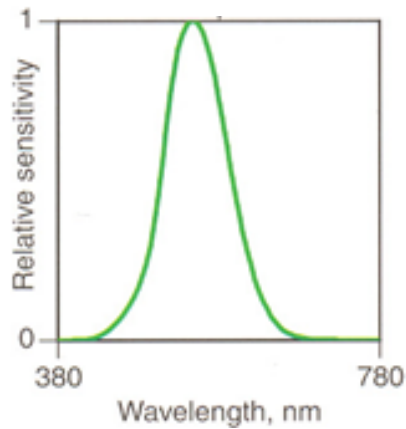
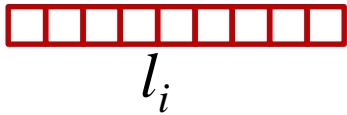
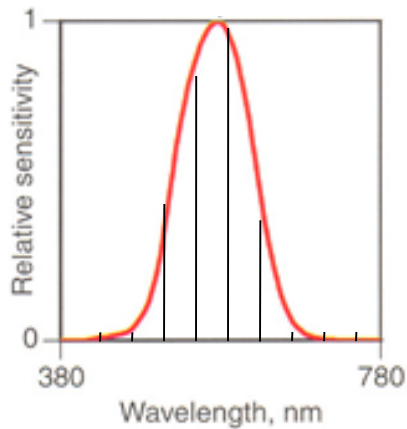
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1 number<sub>25</sub>

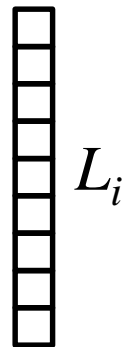
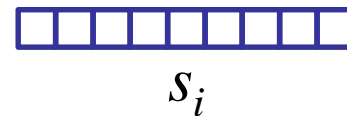
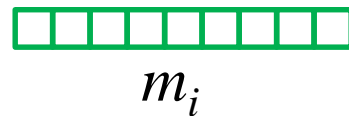
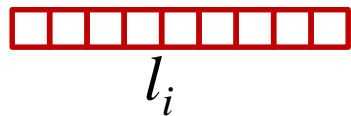
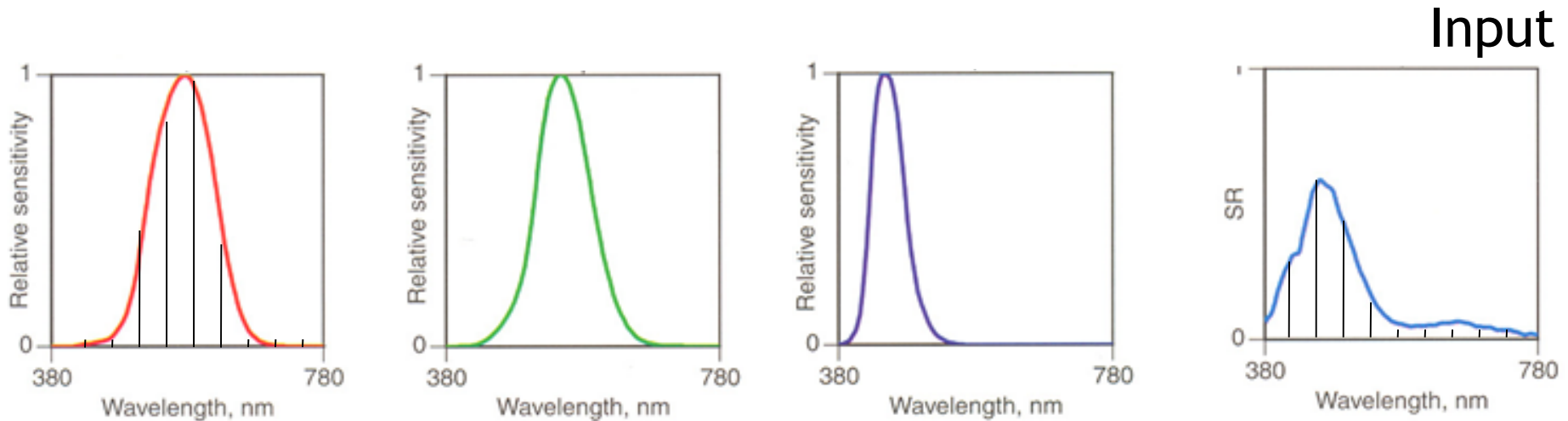
# Discrete case

- Cones and input spectrum represented as **vectors**

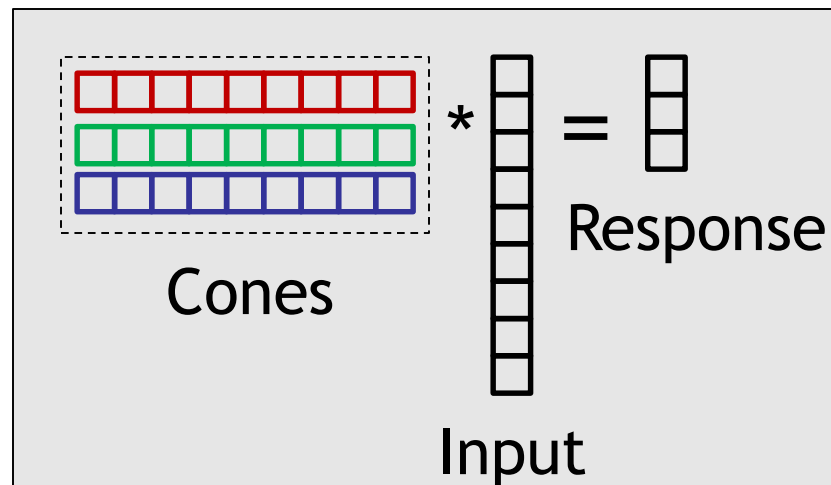


# Discrete case

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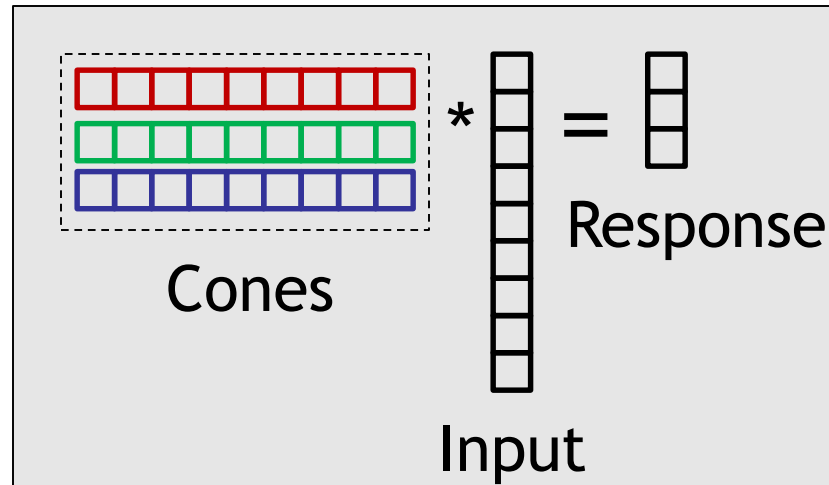


- Response is matrix-vector multiplication
- Integration is now summation

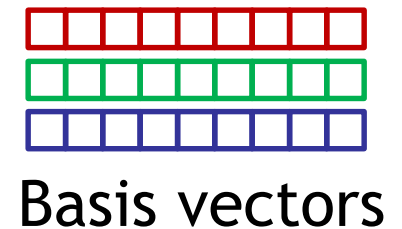


# Discrete case

- Response is matrix-vector multiplication
- **Linear** map!



- **Projection** of input onto three basis vectors

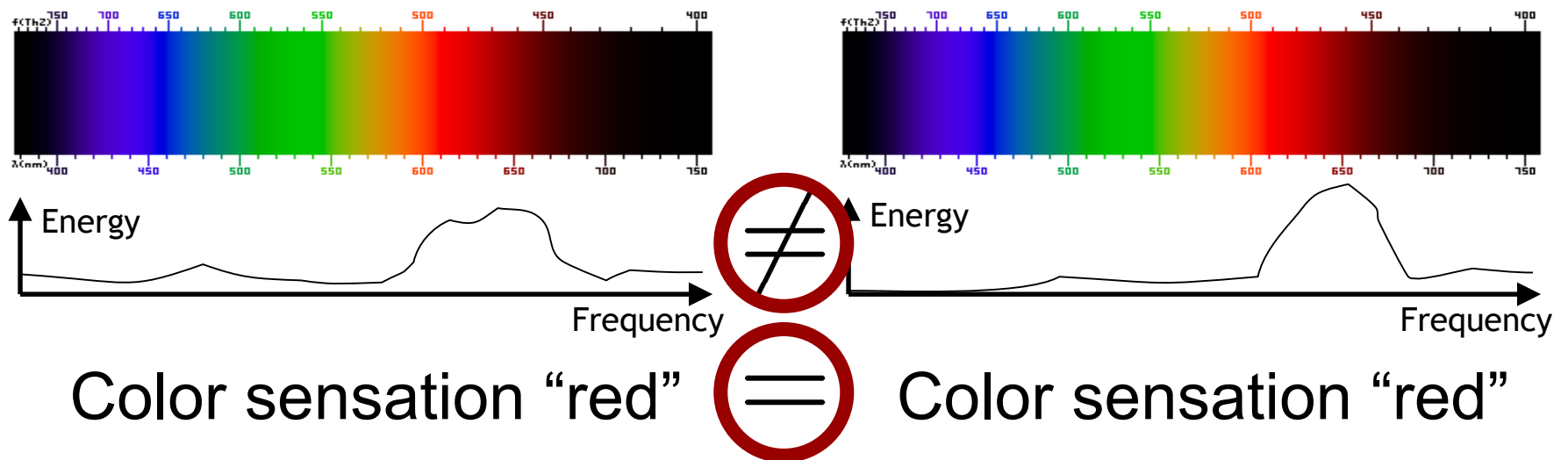


- Basis vectors in general not orthogonal

# Metamerism

[http://en.wikipedia.org/wiki/Metamerism\\_%28color%29](http://en.wikipedia.org/wiki/Metamerism_%28color%29)

- Different spectra, same response
  - Such spectra are called **metamers**
- Intuitive reason for metamerism
  - Arbitrary spectrum is “infinite dimensional” (has infinite number of degrees of freedom)
  - Response has three dimensions
  - Loose information

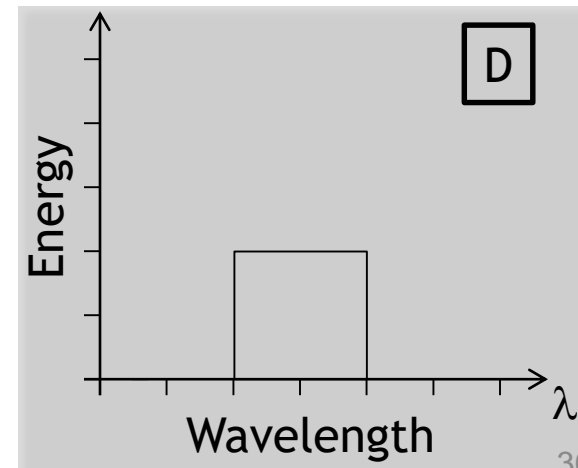
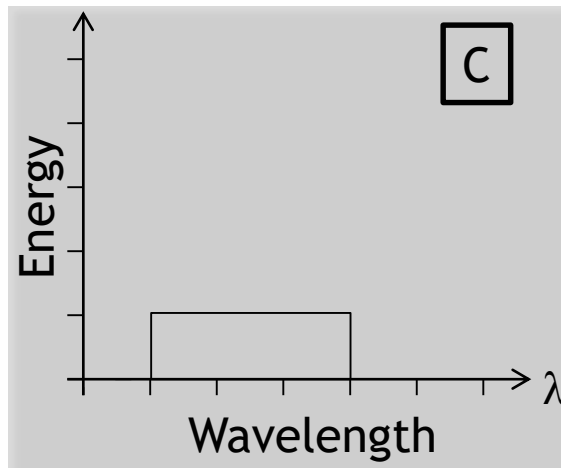
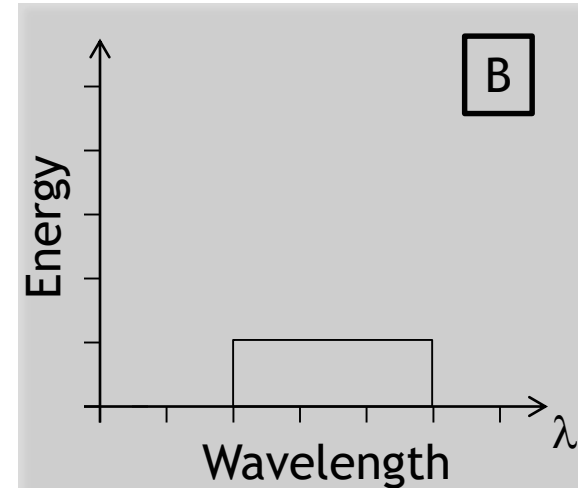
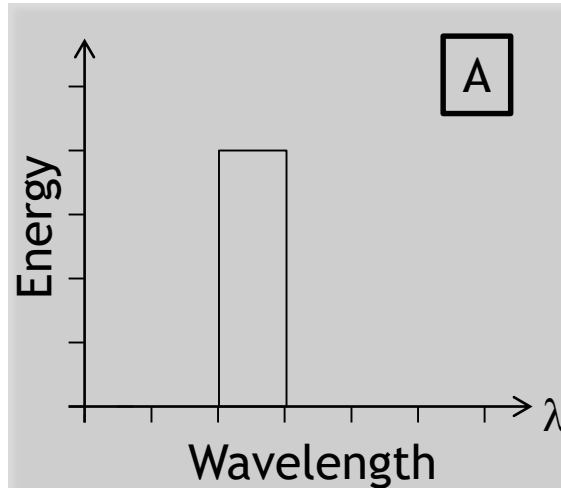
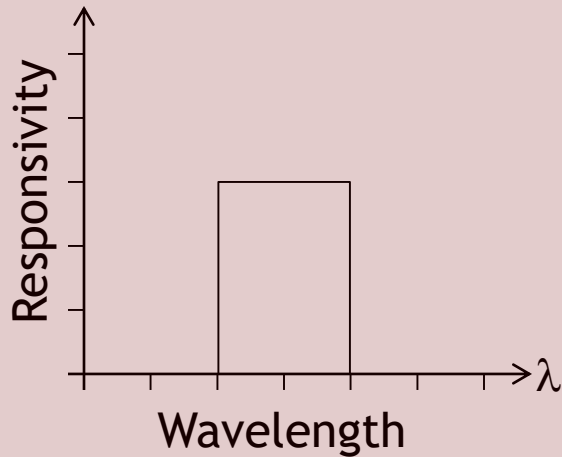


# Metamers

- Which stimuli are metamers?

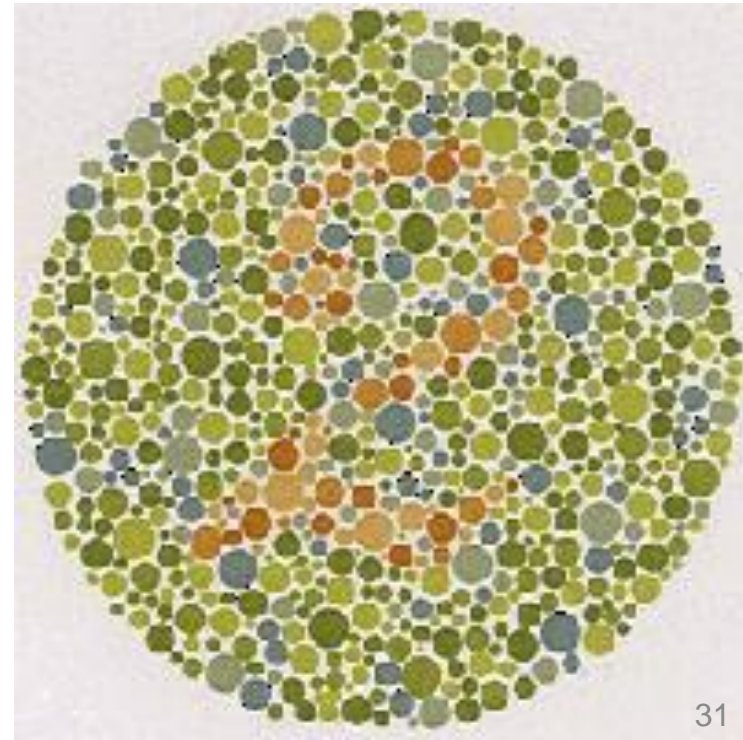
## Stimuli

### Response curve



# Color blindness

- One type of cone missing, damaged
- Different types of color blindness, depending on type of cone
- Can distinguish even fewer colors
- But we are all a little color blind...
- Simulate color blindness  
<http://www.vischeck.com/>



# Note

- Color perception is much more complicated than LMS cones...
- LMS cone responses just input to further processing
- Visual pathway

LMS cone responses

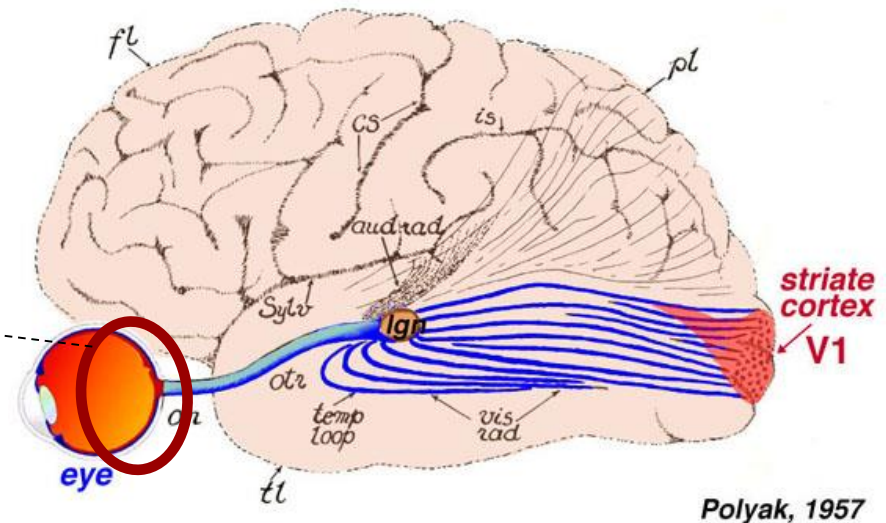


Figure 8. Visual input to the brain goes from eye to LGN and then to primary visual cortex, or area V1, which is located in the posterior of the occipital lobe. Adapted from Polyak (1957).



# Opponent process theory

- After sensing by cones, colors are encoded as red versus green, blue versus yellow, and black versus white

[http://en.wikipedia.org/wiki/Opponent\\_process](http://en.wikipedia.org/wiki/Opponent_process)

- First proposed in 19<sup>th</sup> century
- Physiological evidence found in the 1950s

# Color constancy (chromatic adaptation)

- What color is this sheet of paper?



# Color constancy (chromatic adaptation)

- Color of object is perceived as the same even under varying illumination
  - White object under red illumination reflects red light, yet it is still perceived as white



# Nonlinear processing

- Perceived contrast is related to ratio of brightness, not absolute difference
  - Two colors with (physical) brightness  $b_1$  and  $b_2$
  - Human visual system “computes”  
 $\log(b_1/b_2) = \log(b_1) - \log(b_2)$ , not  $b_1 - b_2$
- Many more complicated effects



[http://www.johnsadowski.com/big\\_spanish\\_castle.html](http://www.johnsadowski.com/big_spanish_castle.html)



[http://www.johnsadowski.com/big\\_spanish\\_castle.html](http://www.johnsadowski.com/big_spanish_castle.html)

# Summary

- Simplified model for initial physiological response to light
  - Response curves based on absorbance of SML cone pigments
  - Grassmann's law: linearity
- But:  
„Color perception is not just the measurement of the spectrum of a single light ray, but depends on the **spatial** and **temporal context** of the scene“

# Today

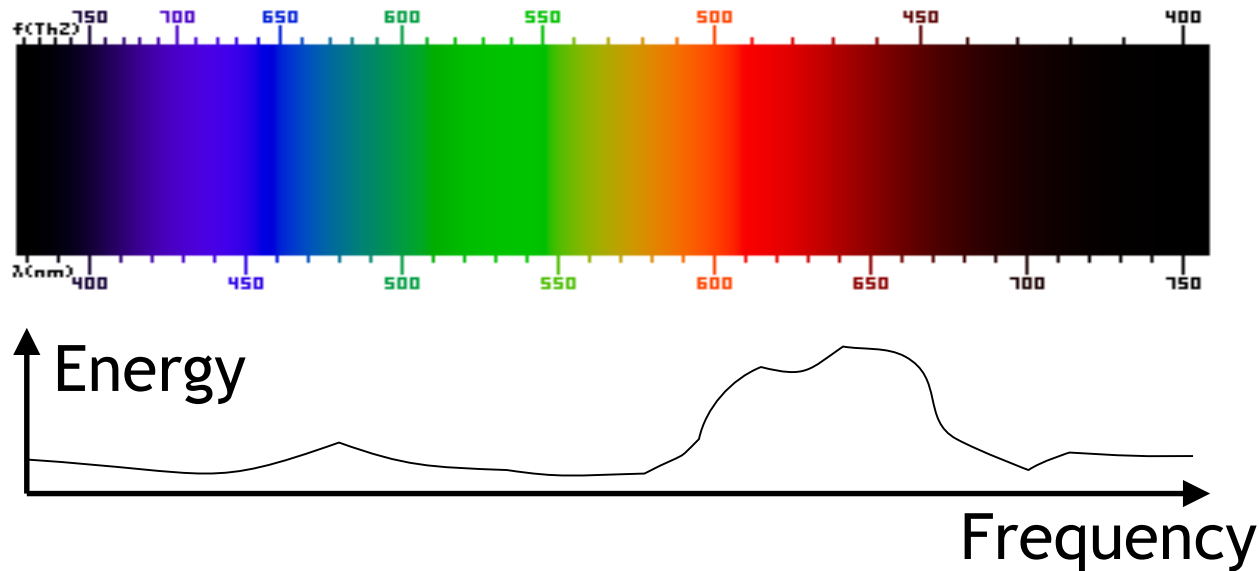
## Color

- Physics background
- Color perception
- **Color spaces**
- Color reproduction on monitors
- Perceptually uniform color spaces



# Color spaces

- How can we represent, reproduce color?
- Brute force: store full spectral energy distribution
  - Disadvantages?



# Color spaces

- Representation should be complete, but as compact as possible
  - Any pair of colors that can be distinguished by humans should have two different representations
  - Any pair of colors that appears the same to humans should have the same representation

# Color spaces

## “Putting numbers on colors”

- Set of parameters describing a color sensation
- “Coordinate system” for colors
- Three types of cones, expect three parameters to be sufficient
- Why not use L,M,S cone absorptions according to model from before?
  - Historical reasons, not known until 1980s

# Trichromatic theory

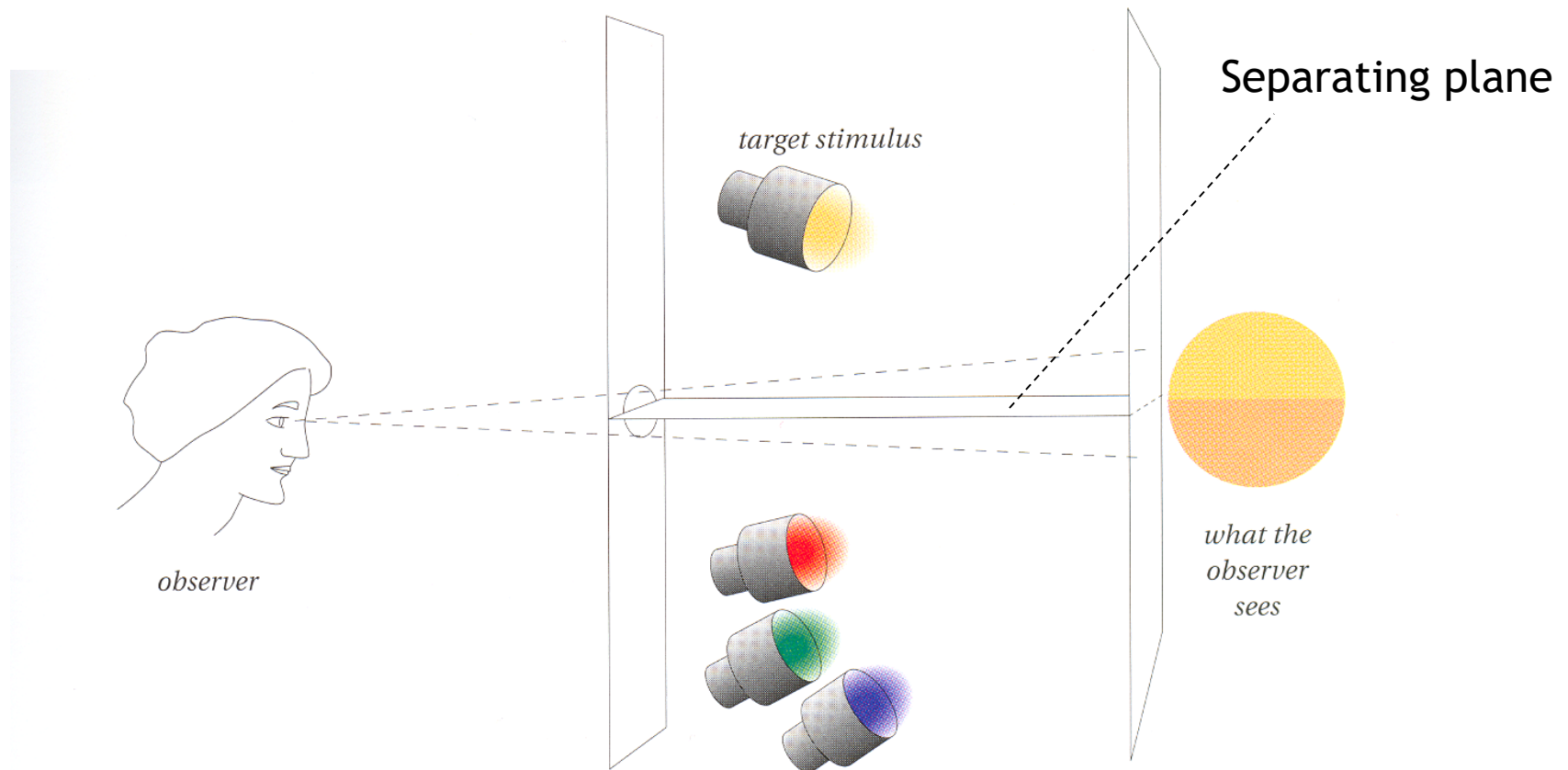
- Claims any color can be represented as a **weighted sum of three primary colors**
- Propose red, green, blue as primaries
- Developed in 18<sup>th</sup>, 19<sup>th</sup> century, before discovery of photoreceptor cells (Thomas Young, Hermann von Helmholtz)
- Not quite true, but good intuition for defining color spaces

# Tristimulus experiment

- Given arbitrary color, want to know the weights for the three primaries to match the color
- Weights called **tristimulus values**
  - Use these as “color coordinates”
- Experiments by CIE, circa 1920
  - Commission Internationale de l’Eclairage, International Commission on Illumination  
[http://en.wikipedia.org/wiki/CIE\\_1931\\_color\\_space](http://en.wikipedia.org/wiki/CIE_1931_color_space)

# Tristimulus experiment

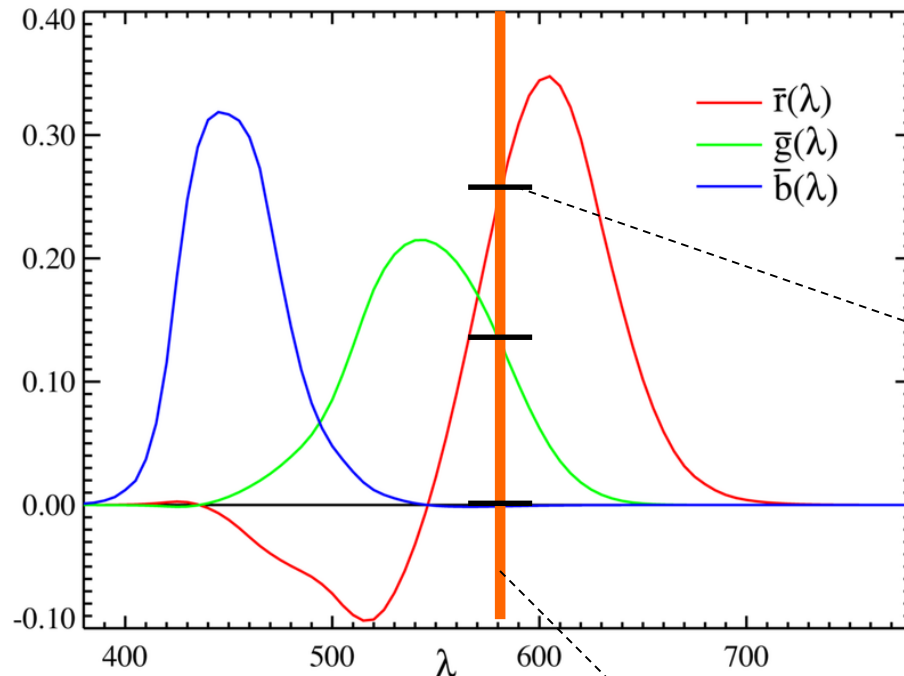
- Goal: find tristimulus values for spectral target colors  
[http://en.wikipedia.org/wiki/Spectral\\_color](http://en.wikipedia.org/wiki/Spectral_color)
- Setup: well defined standard viewing conditions



*The observer adjusts the intensities of the red, green, and blue lamps until they match the target stimulus on the split screen.*

# Tristimulus experiment

- Spectral primary colors were chosen
  - Blue (435.8nm), green (546.1nm), red (700nm)
- Matching curves for monochromatic target



- Negative values!

Target (580nm)

Weight for  
red primary

# Tristimulus experiment

## Negative values

- Some spectral colors could not be matched by primaries in the experiment
- “Trick”
  - One primary could be added to the source
  - Match with the other two
  - Weight of primary added to the source is considered negative

## Photoreceptor absorption vs. matching curve

- **Not the same!**



# Tristimulus values

- **Goal:** given arbitrary spectrum, find weights  $R$ ,  $G$ ,  $B$  of primaries such that weighted sum of primaries is perceived the same as input spectrum
  - Get a **metamer** of input spectrum
- **Grassmann's law:** „color perception is linear“
  - Matching values for a sum of spectra with small spikes are the same as sum of matching values for the spikes
  - In the limit (spikes are infinitely narrow)

$$R = \int \bar{r}(\lambda) L(\lambda) d\lambda$$

$$G = \int \bar{g}(\lambda) L(\lambda) d\lambda$$

$$B = \int \bar{b}(\lambda) L(\lambda) d\lambda$$

- Monochromatic matching curves  $\bar{r}(\lambda)$ ,  $\bar{g}(\lambda)$ ,  $\bar{b}(\lambda)$

# Summary

- Matching curves  $\bar{r}(\lambda)$ ,  $\bar{g}(\lambda)$ ,  $\bar{b}(\lambda)$  define CIE RGB color space
  - Given spectrum, obtain CIE RGB values, or color “coordinates”
  - Every **distinct color sensation** can be represented using **distinct CIE RGB tristimulus values**
  - Many distinct spectra lead to same CIE RGB values (metamers)
- But
  - Not every color sensation can be produced with three primaries (negative values)
  - CIE RGB values directly relate to color perception only under **standard viewing conditions** used in matching experiment!

# CIE color spaces

- CIE was not satisfied with range of RGB values for visible colors
  - Negative values
- Defined CIE XYZ color space via simple mathematical transformation  
[http://en.wikipedia.org/wiki/CIE\\_1931\\_color\\_space#Definition\\_of\\_the\\_CIE\\_XYZ\\_color\\_space](http://en.wikipedia.org/wiki/CIE_1931_color_space#Definition_of_the_CIE_XYZ_color_space)
- Most common color space still today

# CIE XYZ color space

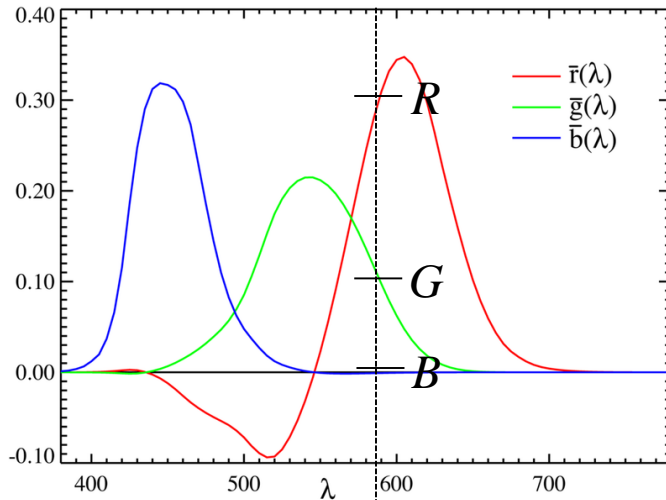
- **Linear transformation** of CIE RGB

$$\begin{bmatrix} X \\ Y \\ Z \end{bmatrix} = \frac{1}{b_{21}} \begin{bmatrix} b_{11} & b_{12} & b_{13} \\ b_{21} & b_{22} & b_{23} \\ b_{31} & b_{32} & b_{33} \end{bmatrix} \begin{bmatrix} R \\ G \\ B \end{bmatrix} = \frac{1}{0.17697} \begin{bmatrix} 0.49 & 0.31 & 0.20 \\ 0.17697 & 0.81240 & 0.01063 \\ 0.00 & 0.01 & 0.99 \end{bmatrix} \begin{bmatrix} R \\ G \\ B \end{bmatrix}$$

CIE XYZ ←----- CIE RGB

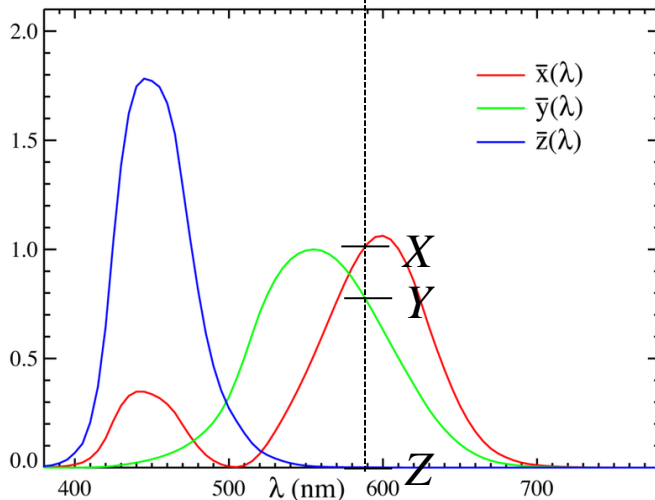
- Determined coefficients such that
  - $Y$  corresponds to an experimentally determined brightness
  - No negative values in matching curves
  - White is  $XYZ=(1/3,1/3,1/3)$

# CIE XYZ color space



CIE RGB matching curves

$$\begin{bmatrix} R \\ G \\ B \end{bmatrix}$$



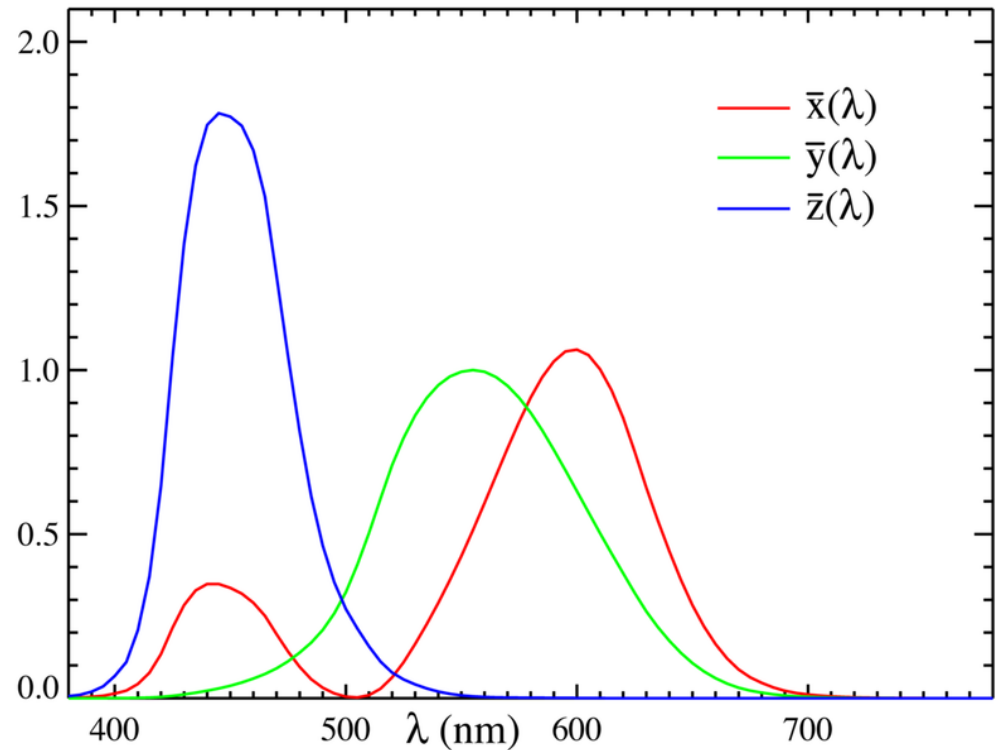
CIE XYZ matching curves

$$\begin{bmatrix} X \\ Y \\ Z \end{bmatrix} = \frac{1}{0.17697} \begin{bmatrix} 0.49 & 0.31 & 0.20 \\ 0.17697 & 0.81240 & 0.01063 \\ 0.00 & 0.01 & 0.99 \end{bmatrix} \begin{bmatrix} R \\ G \\ B \end{bmatrix}$$

# CIE XYZ color space

## Matching curves

- No corresponding physical primaries



## Tristimulus values

- Always positive!

$$X = \int \bar{x}(\lambda) L(\lambda) d\lambda$$

$$Y = \int \bar{y}(\lambda) L(\lambda) d\lambda$$

$$Z = \int \bar{z}(\lambda) L(\lambda) d\lambda$$

# Summary

- CIE XYZ obtained using linear transformation of CIE RGB
- Most commonly used quantification of colors used today  
[http://en.wikipedia.org/wiki/CIE\\_1931\\_color\\_space#Definition\\_of\\_the\\_CIE\\_XYZ\\_color\\_space](http://en.wikipedia.org/wiki/CIE_1931_color_space#Definition_of_the_CIE_XYZ_color_space)
- Most other standard color spaces defined by a one-to-one mapping from CIE XYZ
  - Not necessarily linear mapping, as between CIE XYZ and CIE RGB

# Visualizing CIE XYZ

- Interpret XYZ as 3D coordinates
- Plot corresponding color at each point
- Many XYZ values do not correspond to visible colors



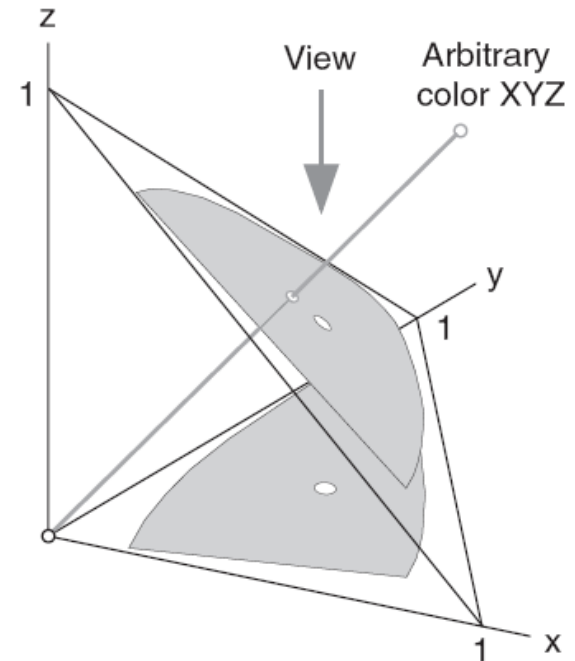


# Chromaticity diagram

- Project to XYZ coordinates to 2D for more convenient visualization

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

- Drop z-coordinate



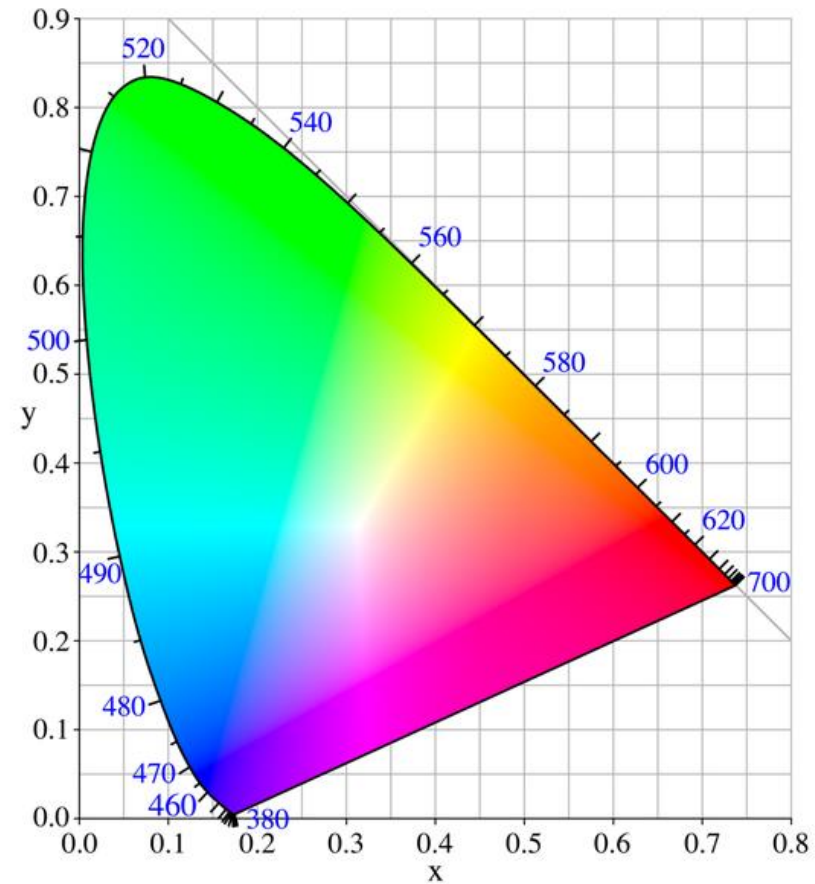
# Chromaticity diagram

- Factor out luminance (perceived brightness) and chromaticity (hue)
  - $x, y$  represent chromaticity of a color
  - $Y$  is luminance
- CIE  $xyY$  color space
- Reconstruct  $XYZ$  values from  $xyY$

$$X = \frac{Y}{y}x \quad Z = \frac{Y}{y}(1 - x - y)$$

# Chromaticity diagram

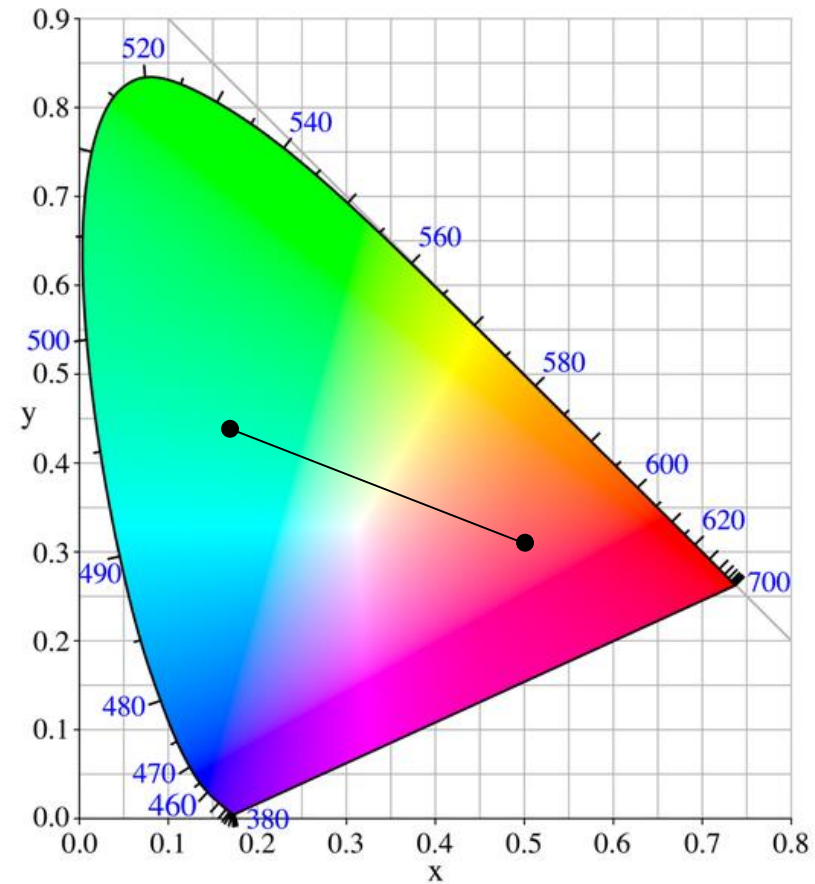
- Visualizes  $x, y$  plane (chromaticities)
- Pure spectral colors on boundary



Colors shown do not correspond to colors represented by  $(x, y)$  coordinates!

# Chromaticity diagram

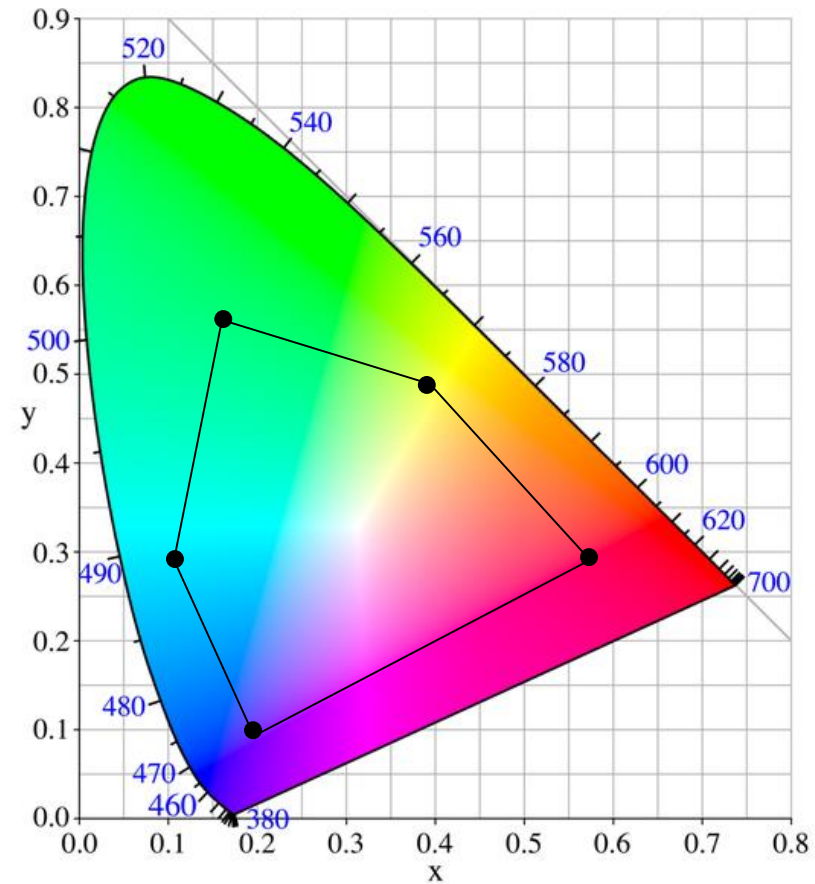
- Weighted sum of any two colors lies on line connecting colors



Colors shown do not correspond to colors represented by (x,y) coordinates!

# Chromaticity diagram

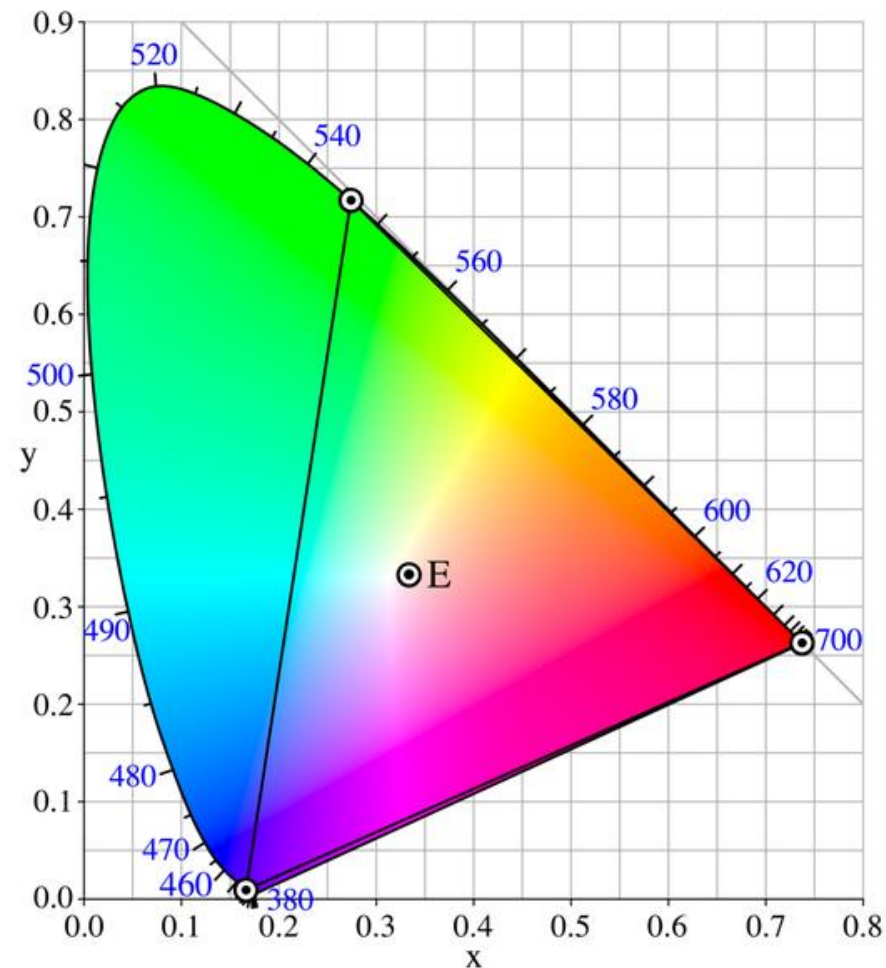
- Weighted sum of any number of colors lies in convex hull of colors (gamut)



Colors shown do not correspond to colors represented by  $(x,y)$  coordinates!

# Gamut

- Any device based on three primaries can only produce colors within the triangle spanned by the primaries
- Does not cover all visible colors
- Points outside gamut correspond to negative weights of primaries



Gamut of CIE RGB  
primaries

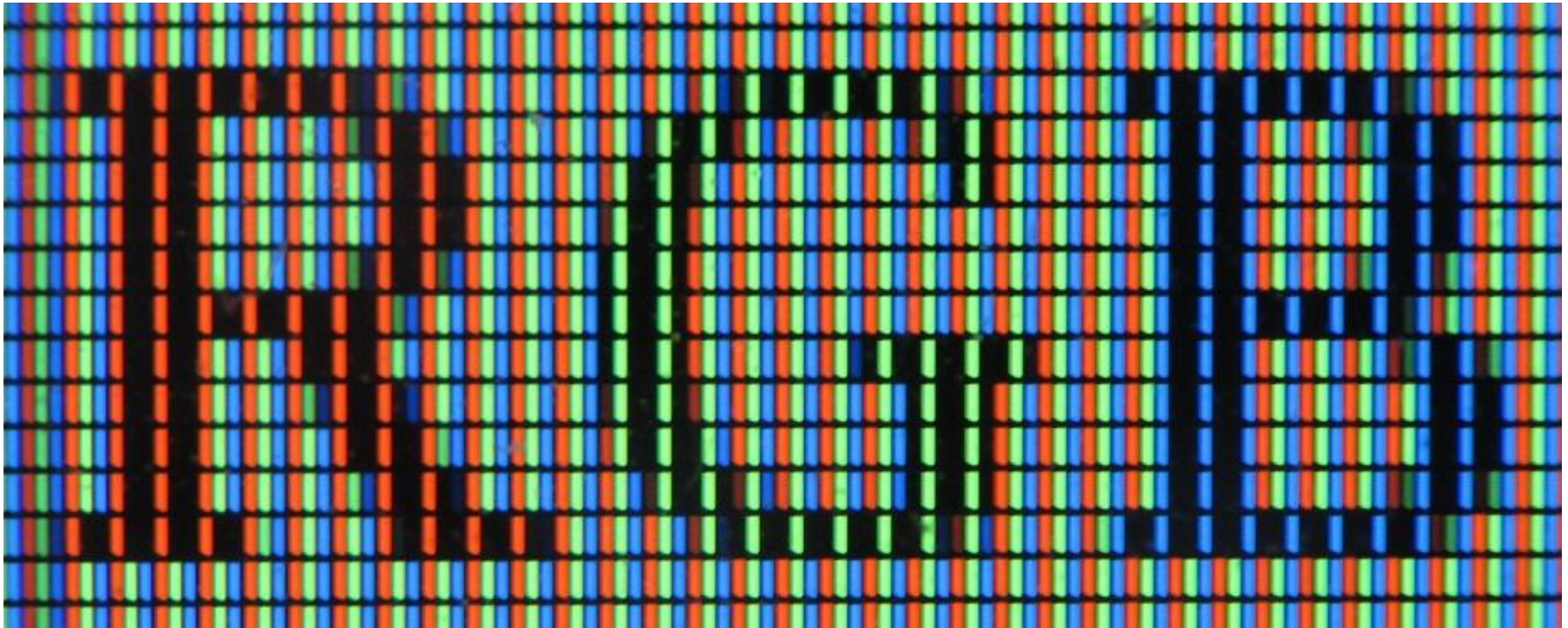
# Today

## Color

- Physics background
- Color perception
- Color spaces
- **Color reproduction on monitors**
- Perceptually uniform color spaces

# RGB monitors

- Each pixel consists of R,G,B subpixels



RGB



# RGB monitors

- Given `rgb` values, what color will your monitor produce?
  - I.e., what are the CIE XYZ or CIE RGB coordinates of the displayed color?
  - How are OpenGL RGB values related to CIE XYZ, CIE RGB?
- Usually you don't know
  - OpenGL RGB  $\neq$  CIE XYZ, CIE RGB

# “Ideal” RGB monitor

- Assumptions
  - We know XYZ values for RGB primaries  
 $(X_r, Y_r, Z_r) (X_g, Y_g, Z_g) (X_b, Y_b, Z_b)$
  - Monitor is linear (emitted intensity proportional to input signal)
- **Not true in practice!**
- **rgb input** to monitor produces output

$$\begin{bmatrix} X_s \\ Y_s \\ Z_s \end{bmatrix} = r \begin{bmatrix} X_r \\ Y_r \\ Z_r \end{bmatrix} + g \begin{bmatrix} X_g \\ Y_g \\ Z_g \end{bmatrix} + b \begin{bmatrix} X_b \\ Y_b \\ Z_b \end{bmatrix}$$

- Get **a transformation matrix**: monitor primaries define their own color space!

$$\begin{bmatrix} X_s \\ Y_s \\ Z_s \end{bmatrix} = \begin{bmatrix} X_r & X_g & X_b \\ Y_r & Y_g & Y_b \\ Z_r & Z_g & Z_b \end{bmatrix} \begin{bmatrix} r \\ g \\ b \end{bmatrix}$$

# “Ideal” RGB monitors

- Given desired XYZ values, find rgb values by inverting transformation matrix

$$\begin{bmatrix} X_s \\ Y_s \\ Z_s \end{bmatrix} \begin{bmatrix} X_r & X_g & X_b \\ Y_r & Y_g & Y_b \\ Z_r & Z_g & Z_b \end{bmatrix}^{-1} = \begin{bmatrix} r \\ g \\ b \end{bmatrix}$$

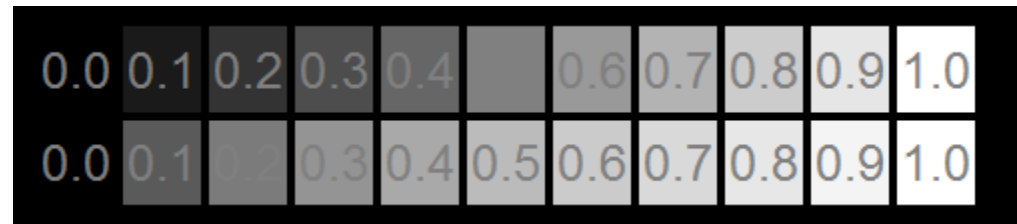
- Similar to change of coordinate systems for 3D points

# In practice

- $XYZ$  values for monitor primaries are usually not directly specified
  - Monitor brightness is adjustable
- “White” depends on illumination due to environment
- Perception of contrast is not linear
  - Perception more sensitive to absolute intensity differences in dark regions compared to bright regions

Linear perception

Linear intensity



# Gamma correction

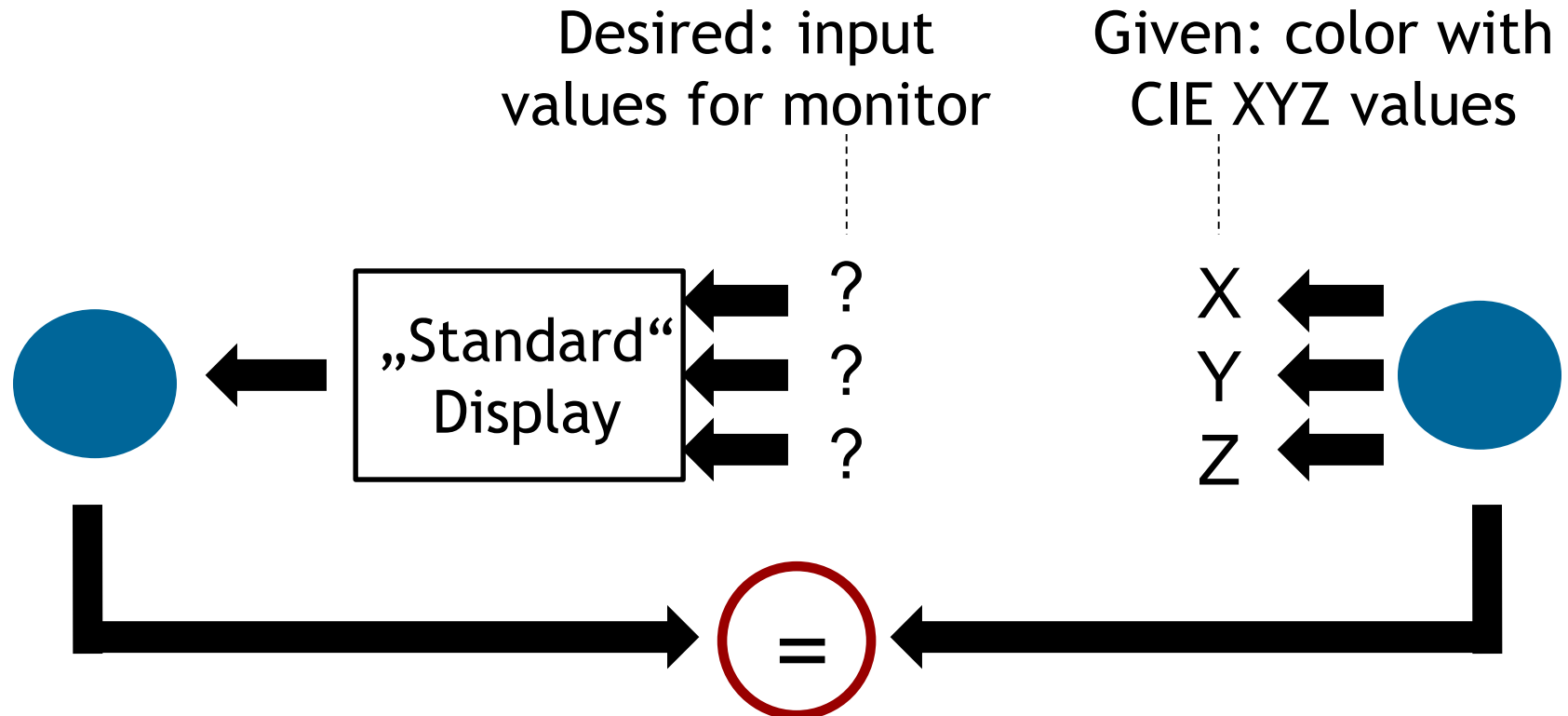
- Non-linear transformation to take into account contrast sensitivity of human visual system (HVS)

[http://en.wikipedia.org/wiki/Gamma\\_correction](http://en.wikipedia.org/wiki/Gamma_correction)

# sRGB color space

- Standard color space designed to describe “standard displays”

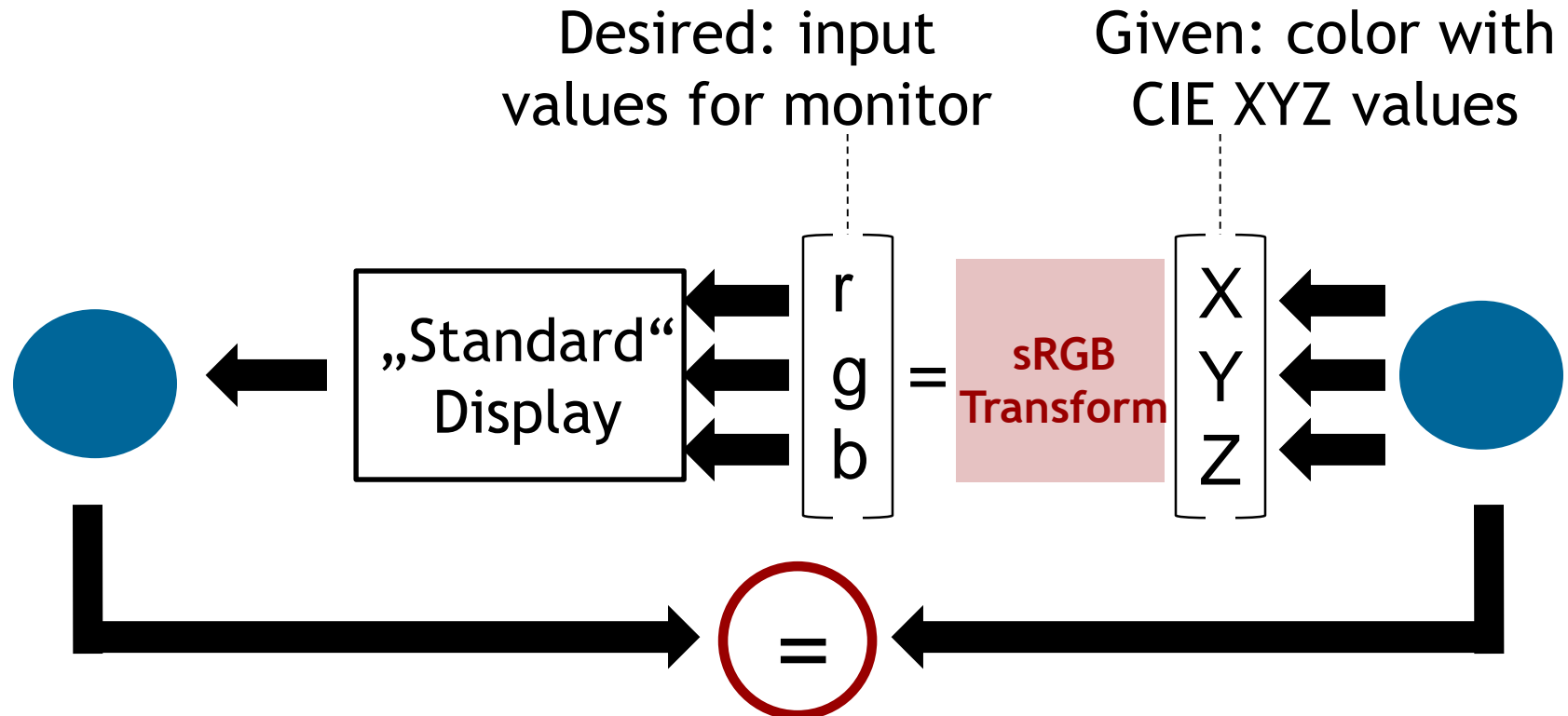
<http://en.wikipedia.org/wiki/SRGB>



# sRGB color space

- Standard color space designed to describe “standard displays”

<http://en.wikipedia.org/wiki/SRGB>



# sRGB color space

[http://en.wikipedia.org/wiki/SRGB\\_color\\_space](http://en.wikipedia.org/wiki/SRGB_color_space)

- CIE XYZ to sRGB transformation

1. Linear mapping

$$\begin{bmatrix} R_{\text{linear}} \\ G_{\text{linear}} \\ B_{\text{linear}} \end{bmatrix} = \begin{bmatrix} 3.2410 & -1.5374 & -0.4986 \\ -0.9692 & 1.8760 & 0.0416 \\ 0.0556 & -0.2040 & 1.0570 \end{bmatrix} \begin{bmatrix} X \\ Y \\ Z \end{bmatrix}$$

2. Gamma correction

$$C_{\text{srgb}} = \begin{cases} 12.92C_{\text{linear}}, & C_{\text{linear}} \leq 0.0031308 \\ (1 + a)C_{\text{linear}}^{1/2.4} - a, & C_{\text{linear}} > 0.0031308 \end{cases}$$

$$C_{\text{linear}} = \{R_{\text{linear}}, G_{\text{linear}}, B_{\text{linear}}\}$$



# sRGB color space

- Defined by a transformation of XYZ values
- „Given XYZ values, sRGB transformation maps XYZ to RGB input values for a standard monitor, such that displayed color matches original XYZ values“
- Based on assumptions about „standard monitor“
- Includes a **non-linear gamma transformation** to compensate for non-linear contrast sensitivity of HVS

# Color calibration

- Color reproduction on consumer monitors often less than perfect
  - Same RGB values on one monitor look different than on another
- Need color **calibration**
  - Derive **device specific transformation of color space**
  - Based on measurements of input-output relation of specific device
  - Standard for digital publishing, printing, photography
  - Consumers do not seem to care
- Color management usually done by operating system
  - E.g., Windows Color System (Vista)
  - Needs appropriate “color profiles” (calibration data)

## Display calibration



# Today

## Color

- Physics background
- Color perception
- Color spaces
- Color reproduction on monitors
- **Perceptually uniform color spaces**

# Perceptually uniform color spaces

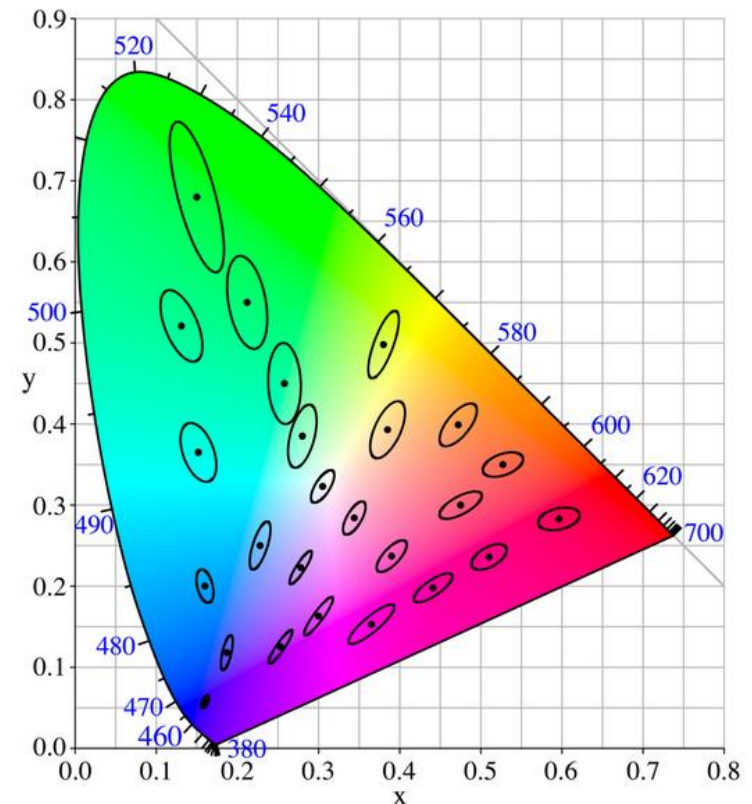
## Definition

Euclidean distance between color coordinates corresponds to perceived difference

- CIE RGB, XYZ are not perceptually uniform
  - Euclidean distance between RGB, XYZ coordinates does not correspond to perceived difference

# MacAdam ellipses

- Experiment (1942) to identify regions in CIE xy color space that are perceived as the same color
- Found elliptical areas, MacAdam ellipses
  - Ellipse boundaries indicate **just noticeable difference** (jnd)  
[http://en.wikipedia.org/wiki/Just-noticeable\\_difference](http://en.wikipedia.org/wiki/Just-noticeable_difference)
- In **perceptually uniform color space**, each point on jnd ellipse should be at same distance to center
  - Use distortion of plane such that ellipses become circles

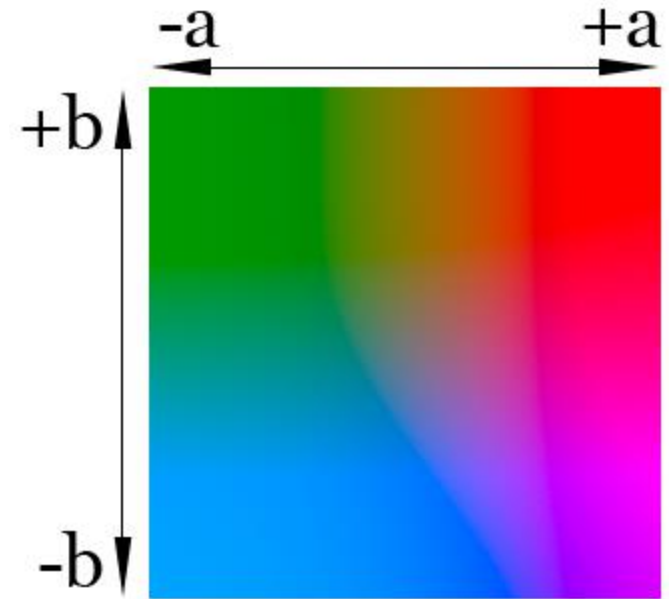


MacAdam ellipses

# CIE $L^*$ , $a^*$ , $b^*$ (CIELAB)

- Most common perceptually uniform color space
  - $L^*$  encodes lightness
  - $a^*$  encodes position between magenta and green
  - $b^*$  encodes position between yellow and blue
- Conversion between CIE XYZ and CIELAB is **non-linear**

[http://en.wikipedia.org/wiki/Lab\\_color\\_space](http://en.wikipedia.org/wiki/Lab_color_space)



CIELAB gamut  
Displayed colors  
do not match  
CIELAB colors

# Next time

- Shading