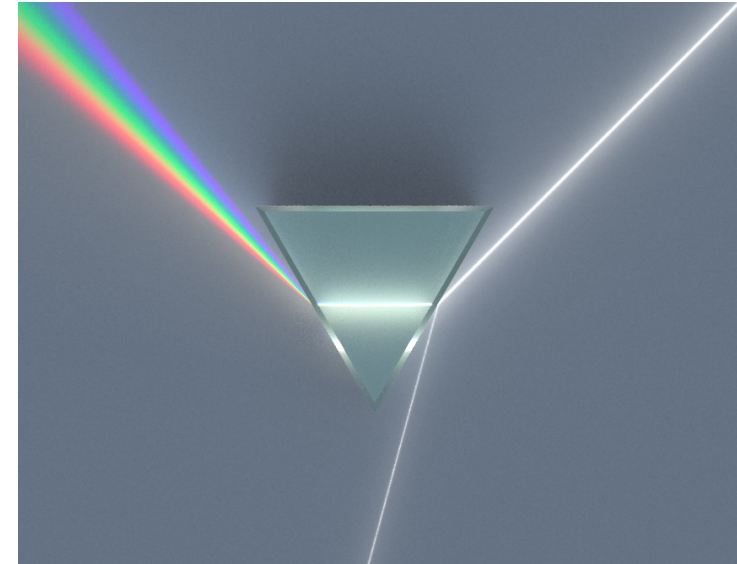
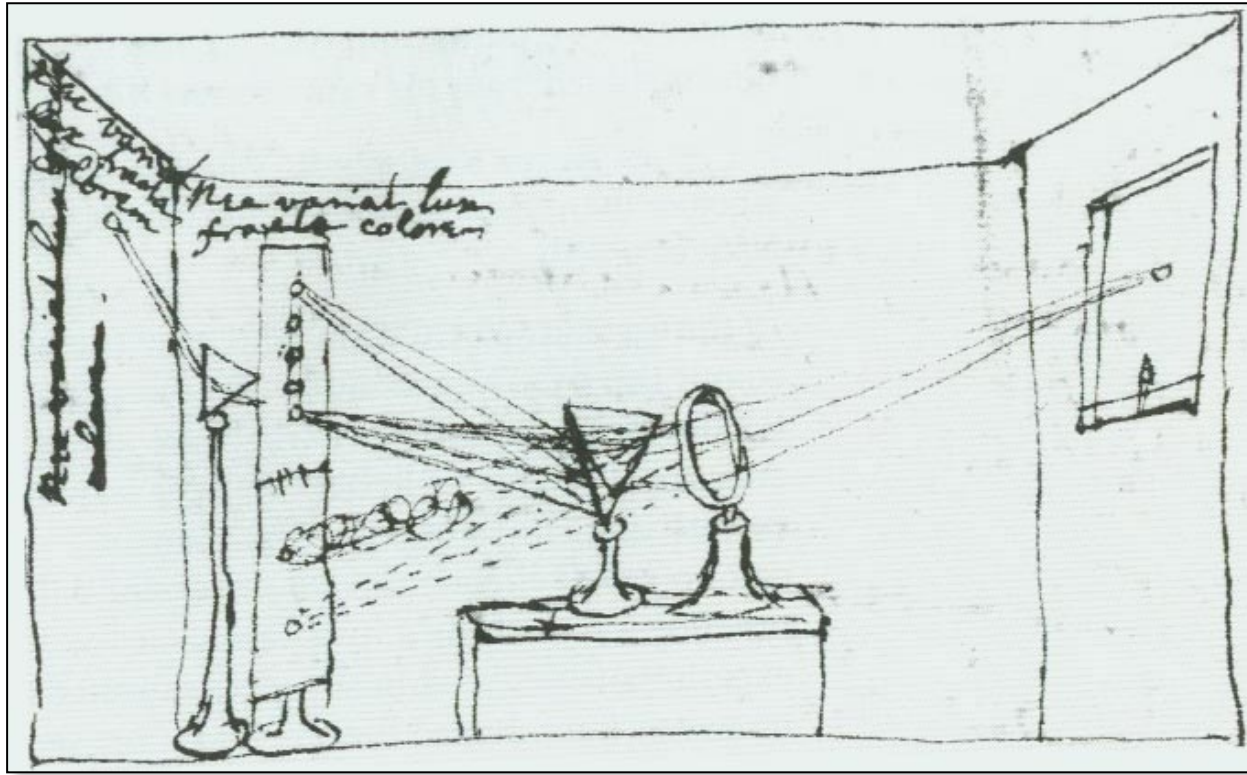


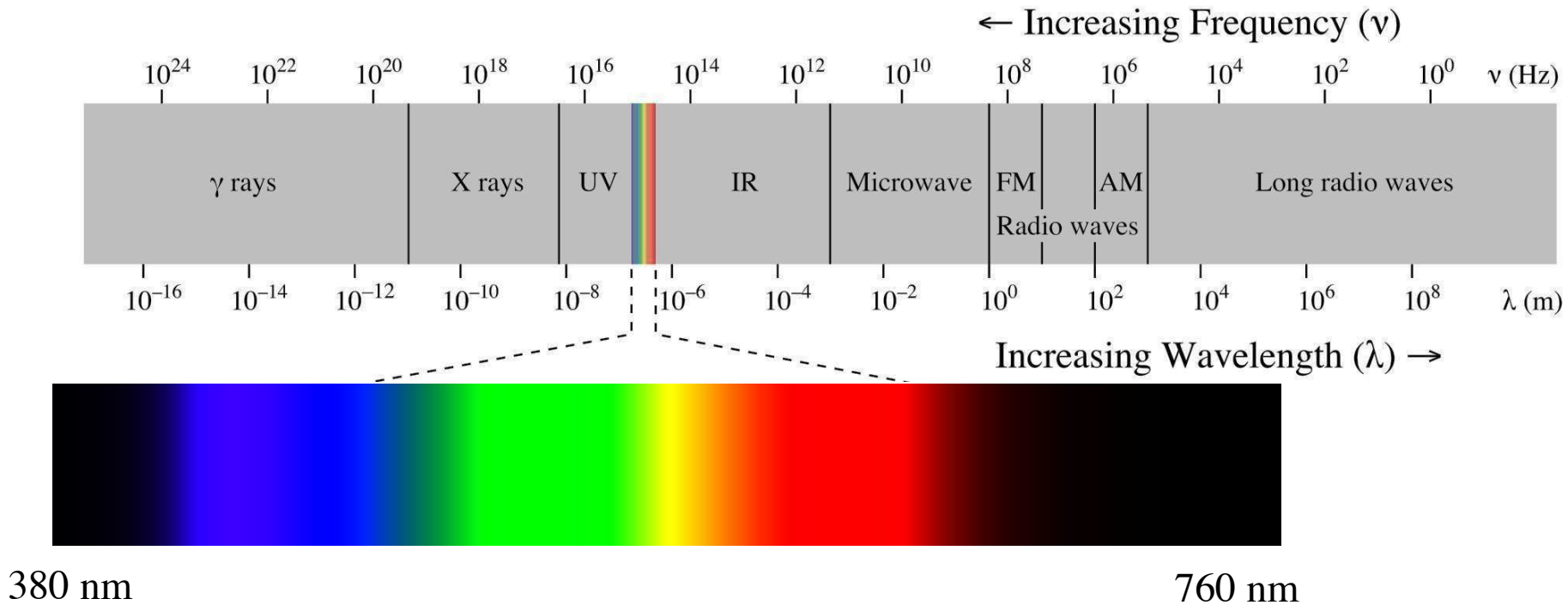
# Introduction to color science

- Trichromacy
- Spectral matching functions
- CIE XYZ color system
- xy-chromaticity diagram
- Color gamut
- Color temperature
- Color balancing algorithms

# Newton's Prism Experiment - 1666



# Color: visible range of the electromagnetic spectrum



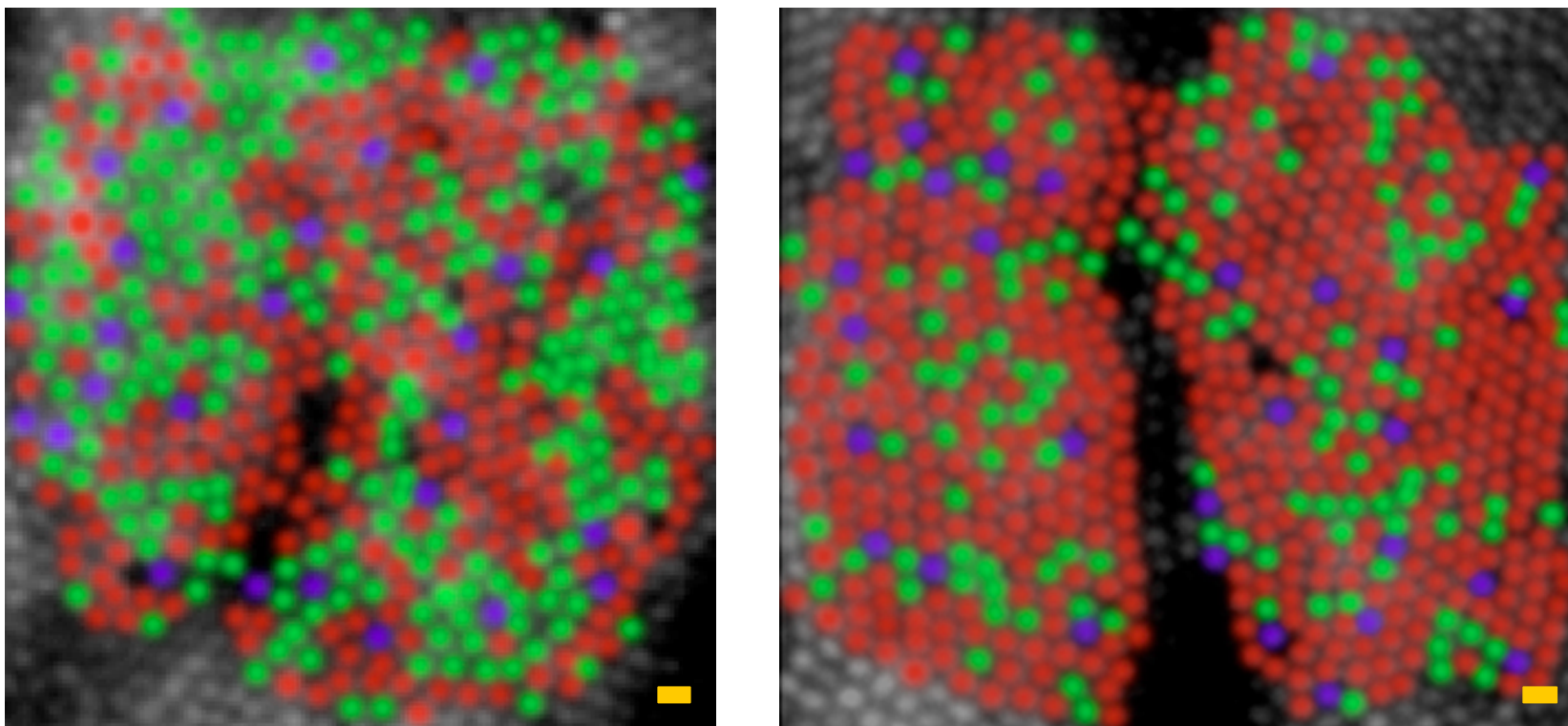
# Radiometric Quantities

| Quantity            |                                                                                                                         | Unit                                                                                            |                                                                                                                          |                                                                                                                                          | Dimension                                                                                                                                                                                                                          | Notes                                                                                                 |                                                                                                                                                                                                                                                                               |
|---------------------|-------------------------------------------------------------------------------------------------------------------------|-------------------------------------------------------------------------------------------------|--------------------------------------------------------------------------------------------------------------------------|------------------------------------------------------------------------------------------------------------------------------------------|------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|-------------------------------------------------------------------------------------------------------|-------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Name                | Symbol <sup>[nb 1]</sup>                                                                                                | Name                                                                                            | Symbol                                                                                                                   | Symbol                                                                                                                                   |                                                                                                                                                                                                                                    |                                                                                                       |                                                                                                                                                                                                                                                                               |
| Radiant energy      |                                                                                                                         | Radiance                                                                                        | $L_{\text{e},\Omega}$ <sup>[nb 5]</sup>                                                                                  | watt per steradian per square metre                                                                                                      | $\text{W}\cdot\text{sr}^{-1}\cdot\text{m}^{-2}$                                                                                                                                                                                    | $\mathbf{M}\cdot\mathbf{T}^{-3}$                                                                      | Radiant flux emitted, reflected, transmitted or received by a <i>surface</i> , per unit solid angle per unit projected area. This is a <i>directional</i> quantity. This is sometimes also confusingly called "intensity".                                                    |
| Radiant energy dens |                                                                                                                         |                                                                                                 |                                                                                                                          |                                                                                                                                          |                                                                                                                                                                                                                                    |                                                                                                       |                                                                                                                                                                                                                                                                               |
| Radiant flux        |                                                                                                                         |                                                                                                 |                                                                                                                          |                                                                                                                                          |                                                                                                                                                                                                                                    |                                                                                                       |                                                                                                                                                                                                                                                                               |
| Spectral flux       |                                                                                                                         |                                                                                                 |                                                                                                                          |                                                                                                                                          |                                                                                                                                                                                                                                    |                                                                                                       |                                                                                                                                                                                                                                                                               |
| Radiant intensity   |                                                                                                                         |                                                                                                 |                                                                                                                          |                                                                                                                                          |                                                                                                                                                                                                                                    |                                                                                                       |                                                                                                                                                                                                                                                                               |
| Spectral intensity  |                                                                                                                         |                                                                                                 |                                                                                                                          |                                                                                                                                          |                                                                                                                                                                                                                                    |                                                                                                       |                                                                                                                                                                                                                                                                               |
| Radiance            |                                                                                                                         | Spectral radiance                                                                               | $L_{\text{e},\Omega,\nu}$ <sup>[nb 3]</sup><br>or<br>$L_{\text{e},\Omega,\lambda}$ <sup>[nb 4]</sup>                     | watt per steradian per square metre per hertz<br><i>or</i><br>watt per steradian per square metre, per metre                             | $\text{W}\cdot\text{sr}^{-1}\cdot\text{m}^{-2}\cdot\text{Hz}^{-1}$<br><i>or</i><br>$\text{W}\cdot\text{sr}^{-1}\cdot\text{m}^{-3}$                                                                                                 | $\mathbf{M}\cdot\mathbf{T}^{-2}$<br><i>or</i><br>$\mathbf{M}\cdot\mathbf{L}^{-1}\cdot\mathbf{T}^{-3}$ | Radiance of a <i>surface</i> per unit frequency or wavelength. The latter is commonly measured in $\text{W}\cdot\text{sr}^{-1}\cdot\text{m}^{-2}\cdot\text{nm}^{-1}$ . This is a <i>directional</i> quantity. This is sometimes also confusingly called "spectral intensity". |
| Spectral radiance   |                                                                                                                         |                                                                                                 |                                                                                                                          |                                                                                                                                          |                                                                                                                                                                                                                                    |                                                                                                       |                                                                                                                                                                                                                                                                               |
| Irradiance          |                                                                                                                         |                                                                                                 |                                                                                                                          |                                                                                                                                          |                                                                                                                                                                                                                                    |                                                                                                       |                                                                                                                                                                                                                                                                               |
| Spectral irradiance |                                                                                                                         |                                                                                                 |                                                                                                                          |                                                                                                                                          |                                                                                                                                                                                                                                    |                                                                                                       |                                                                                                                                                                                                                                                                               |
| Radiosity           |                                                                                                                         |                                                                                                 |                                                                                                                          |                                                                                                                                          |                                                                                                                                                                                                                                    |                                                                                                       |                                                                                                                                                                                                                                                                               |
| Spectral radiosity  |                                                                                                                         |                                                                                                 |                                                                                                                          |                                                                                                                                          |                                                                                                                                                                                                                                    |                                                                                                       |                                                                                                                                                                                                                                                                               |
| Radiant exitance    |                                                                                                                         | Irradiance                                                                                      | $E_{\text{e}}$ <sup>[nb 2]</sup>                                                                                         | watt per square metre                                                                                                                    | $\text{W}/\text{m}^2$                                                                                                                                                                                                              | $\mathbf{M}\cdot\mathbf{T}^{-3}$                                                                      | Radiant flux <i>received</i> by a <i>surface</i> per unit area. This is sometimes also confusingly called "intensity".                                                                                                                                                        |
|                     |                                                                                                                         |                                                                                                 |                                                                                                                          |                                                                                                                                          |                                                                                                                                                                                                                                    |                                                                                                       |                                                                                                                                                                                                                                                                               |
| Spectral exitance   | <div>or</div> <div><math>M_{\text{e},\lambda}</math><sup>[nb 4]</sup></div>                                             |                                                                                                 |                                                                                                                          |                                                                                                                                          |                                                                                                                                                                                                                                    |                                                                                                       |                                                                                                                                                                                                                                                                               |
| Radiant exposure    | $H_{\text{e}}$                                                                                                          | joule per square metre                                                                          | $\text{J}/\text{m}^2$                                                                                                    | $\mathbf{M}\cdot\mathbf{T}^{-2}$                                                                                                         | Radiant energy received by a <i>surface</i> per unit area, or equivalently irradiance of a <i>surface</i> integrated over time of irradiation. This is sometimes also called "radiant fluence".                                    |                                                                                                       |                                                                                                                                                                                                                                                                               |
| Spectral exposure   | <div><math>H_{\text{e},\nu}</math><sup>[nb 3]</sup><br/>or<br/><math>H_{\text{e},\lambda}</math><sup>[nb 4]</sup></div> | <div>joule per square metre per hertz<br/><i>or</i><br/>joule per square metre, per metre</div> | <div><math>\text{J}\cdot\text{m}^{-2}\cdot\text{Hz}^{-1}</math><br/><i>or</i><br/><math>\text{J}/\text{m}^3</math></div> | <div><math>\mathbf{M}\cdot\mathbf{T}^{-1}</math><br/><i>or</i><br/><math>\mathbf{M}\cdot\mathbf{L}^{-1}\cdot\mathbf{T}^{-2}</math></div> | <div>Radiant exposure of a <i>surface</i> per unit frequency or wavelength. The latter is commonly measured in <math>\text{J}\cdot\text{m}^{-2}\cdot\text{nm}^{-1}</math>. This is sometimes also called "spectral fluence".</div> |                                                                                                       |                                                                                                                                                                                                                                                                               |

# Photometric Quantities

| Quantity                                      |                            | Unit                                   |                                                | Dimension                                                           | Notes                                                                                                                     |
|-----------------------------------------------|----------------------------|----------------------------------------|------------------------------------------------|---------------------------------------------------------------------|---------------------------------------------------------------------------------------------------------------------------|
| Name                                          | Symbol <sup>[nb 1]</sup>   | Name                                   | Symbol                                         | Symbol                                                              |                                                                                                                           |
| Luminous energy                               | $Q_v$ <sup>[nb 2]</sup>    | lumen second                           | $\text{lm} \cdot \text{s}$                     | $\text{T} \cdot \text{J}$ <sup>[nb 3]</sup>                         | Units are sometimes called <i>talbots</i> .                                                                               |
| Luminous flux /<br>Luminous power             | $\phi_v$ <sup>[nb 2]</sup> | lumen (= $\text{cd} \cdot \text{sr}$ ) | $\text{lm}$                                    | $\text{J}$ <sup>[nb 3]</sup>                                        | Luminous energy per unit time.                                                                                            |
| Luminous intensity                            | $I_v$                      | candela<br>(= $\text{lm}/\text{sr}$ )  | $\text{cd}$                                    | $\text{J}$ <sup>[nb 3]</sup>                                        | Luminous power per unit <i>solid angle</i> .                                                                              |
| Luminance                                     | $L_v$                      | candela per<br>square metre            | $\text{cd}/\text{m}^2$                         | $\text{L}^{-2} \cdot \text{J}$                                      | Luminous power per unit solid angle per<br>unit <i>projected</i> source area. Units are<br>sometimes called <i>nits</i> . |
| Illuminance                                   | $E_v$                      | lux (= $\text{lm}/\text{m}^2$ )        | $\text{lx}$                                    | $\text{L}^{-2} \cdot \text{J}$                                      | Luminous power <i>incident</i> on a surface.                                                                              |
| Luminous exitance /<br>Luminous emittance     | $M_v$                      | lux                                    | $\text{lx}$                                    | $\text{L}^{-2} \cdot \text{J}$                                      | Luminous power <i>emitted</i> from a surface.                                                                             |
| Luminous exposure                             | $H_v$                      | lux second                             | $\text{lx} \cdot \text{s}$                     | $\text{L}^{-2} \cdot \text{T} \cdot \text{J}$                       |                                                                                                                           |
| Luminous energy<br>density                    | $\omega_v$                 | lumen second<br>per cubic metre        | $\text{lm} \cdot \text{s} \cdot \text{m}^{-3}$ | $\text{L}^{-3} \cdot \text{T} \cdot \text{J}$                       |                                                                                                                           |
| Luminous efficacy                             | $\eta$ <sup>[nb 2]</sup>   | lumen per watt                         | $\text{lm}/\text{W}$                           | $\text{M}^{-1} \cdot \text{L}^{-2} \cdot \text{T}^3 \cdot \text{J}$ | Ratio of luminous flux to <i>radiant flux</i> .                                                                           |
| Luminous efficiency /<br>Luminous coefficient | $V$                        |                                        |                                                | 1                                                                   |                                                                                                                           |

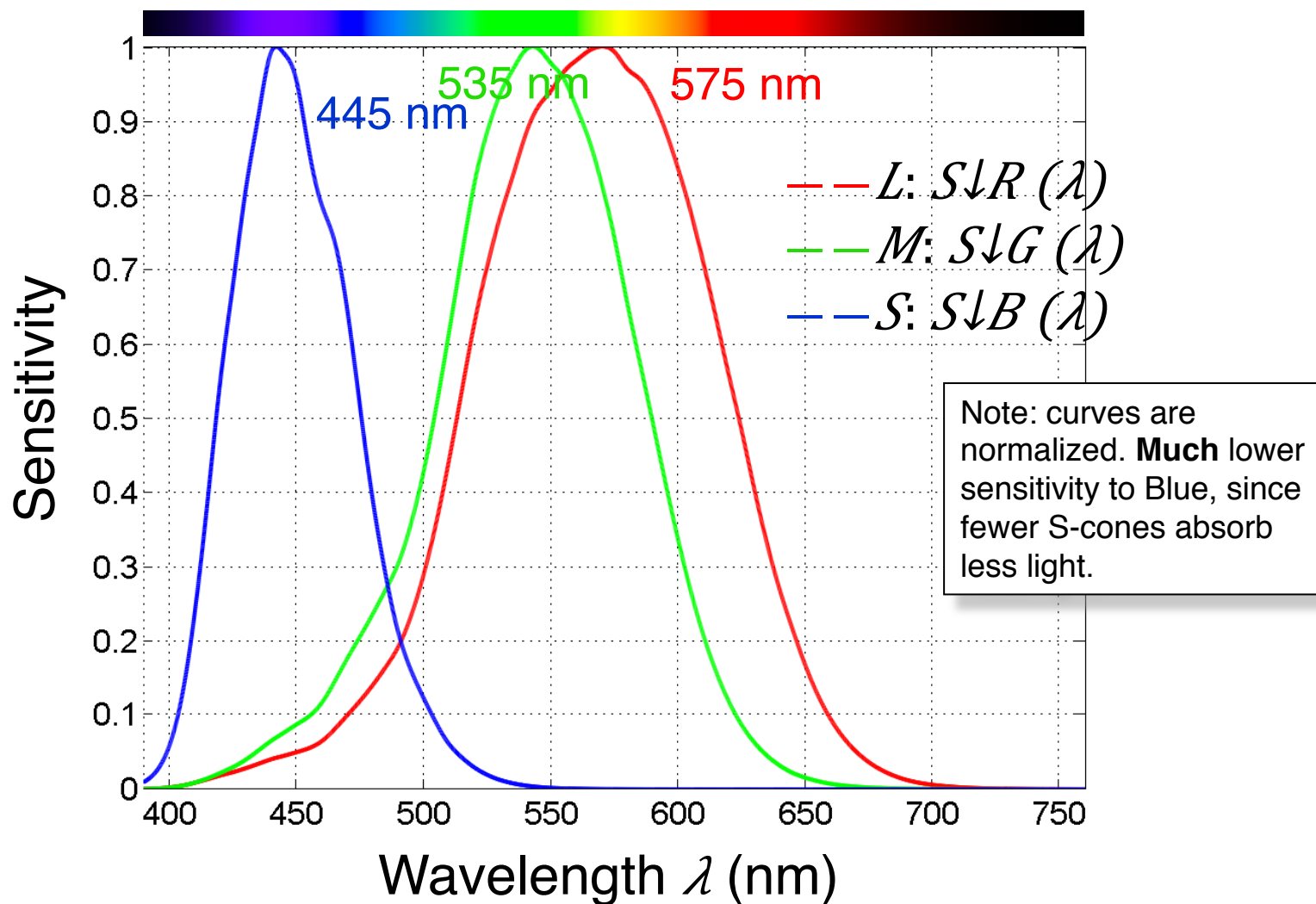
# Human retina



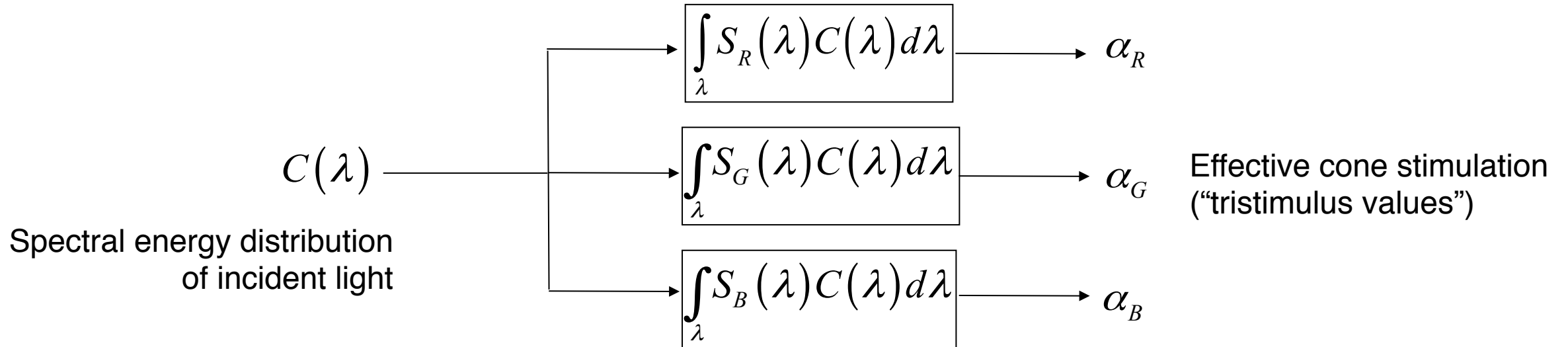
*[Roorda, Williams, 1999]*

Pseudo-color image of nasal retina,  
1 degree eccentricity, in two male subjects, scale bar 5 micron

# Absorption of light in the cones of the human retina



# Three-receptor model of color perception

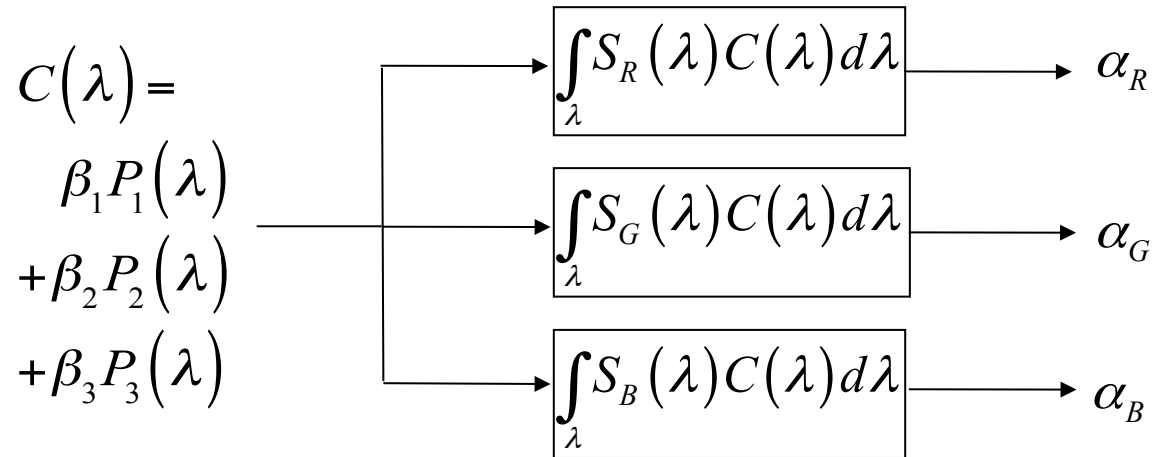


*[T. Young, 1802] [J.C. Maxwell, 1890]*

- Different spectra can map into the same tristimulus values and hence look identical ("metamers")
- Three numbers suffice to represent any color

# Color matching

- Suppose 3 primary light sources with spectra  $P_k(\lambda)$ ,  $k = 1, 2, 3$
- Intensity of each light source can be adjusted by factor  $\beta_k$
- How to choose  $\beta_k$ ,  $k = 1, 2, 3$ , such that desired tristimulus values  $(\alpha_R, \alpha_G, \alpha_B)$  result ?

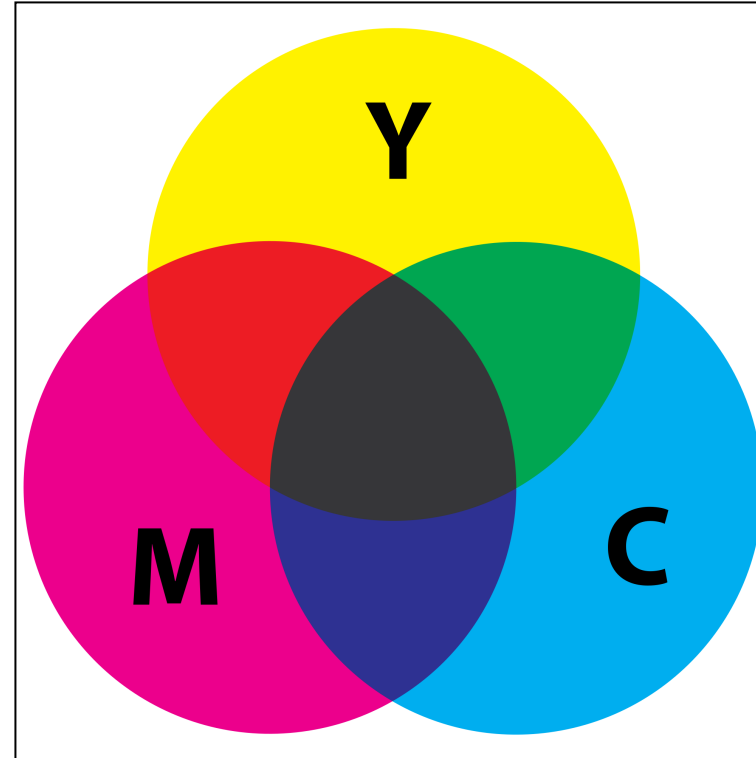
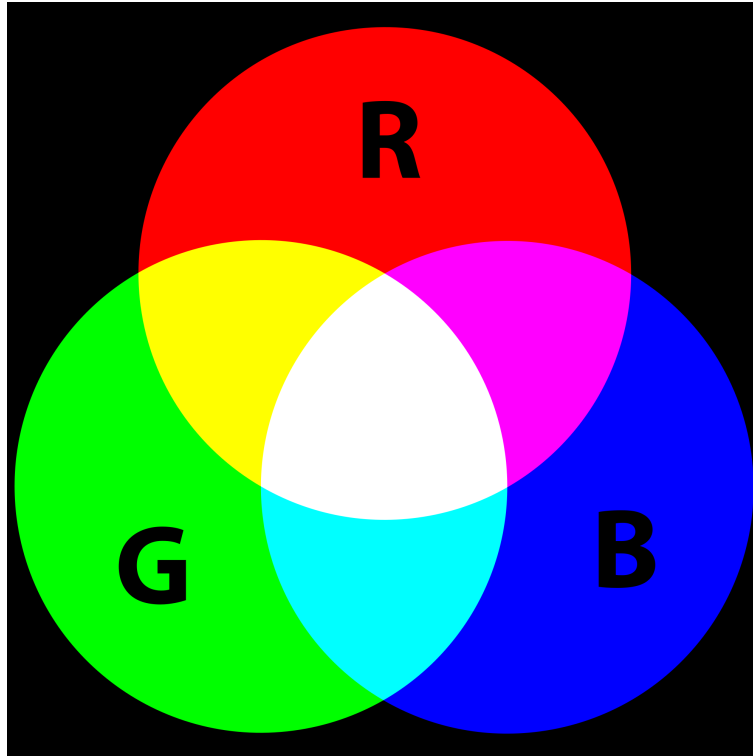


$$\begin{aligned}\alpha_i &= \int_{\lambda} S_i(\lambda) [\beta_1 P_1(\lambda) + \beta_2 P_2(\lambda) + \beta_3 P_3(\lambda)] d\lambda \\ &= \beta_1 \cdot K_{i,1} + \beta_2 \cdot K_{i,2} + \beta_3 \cdot K_{i,3}\end{aligned}$$

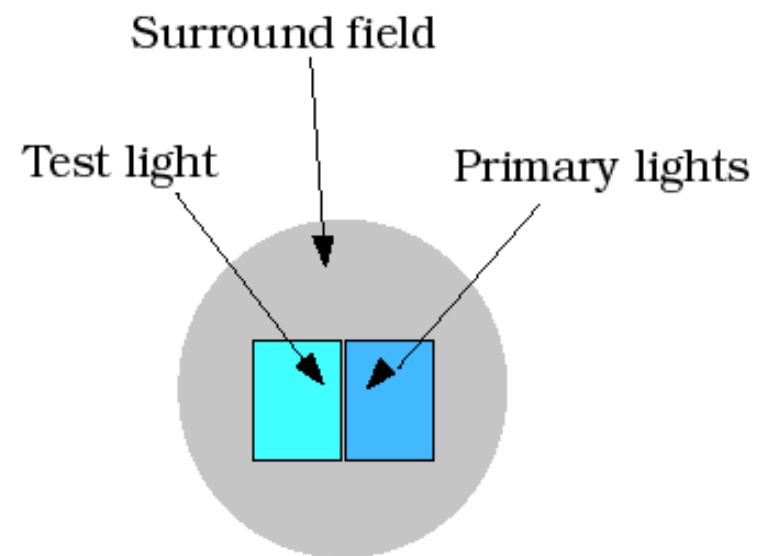
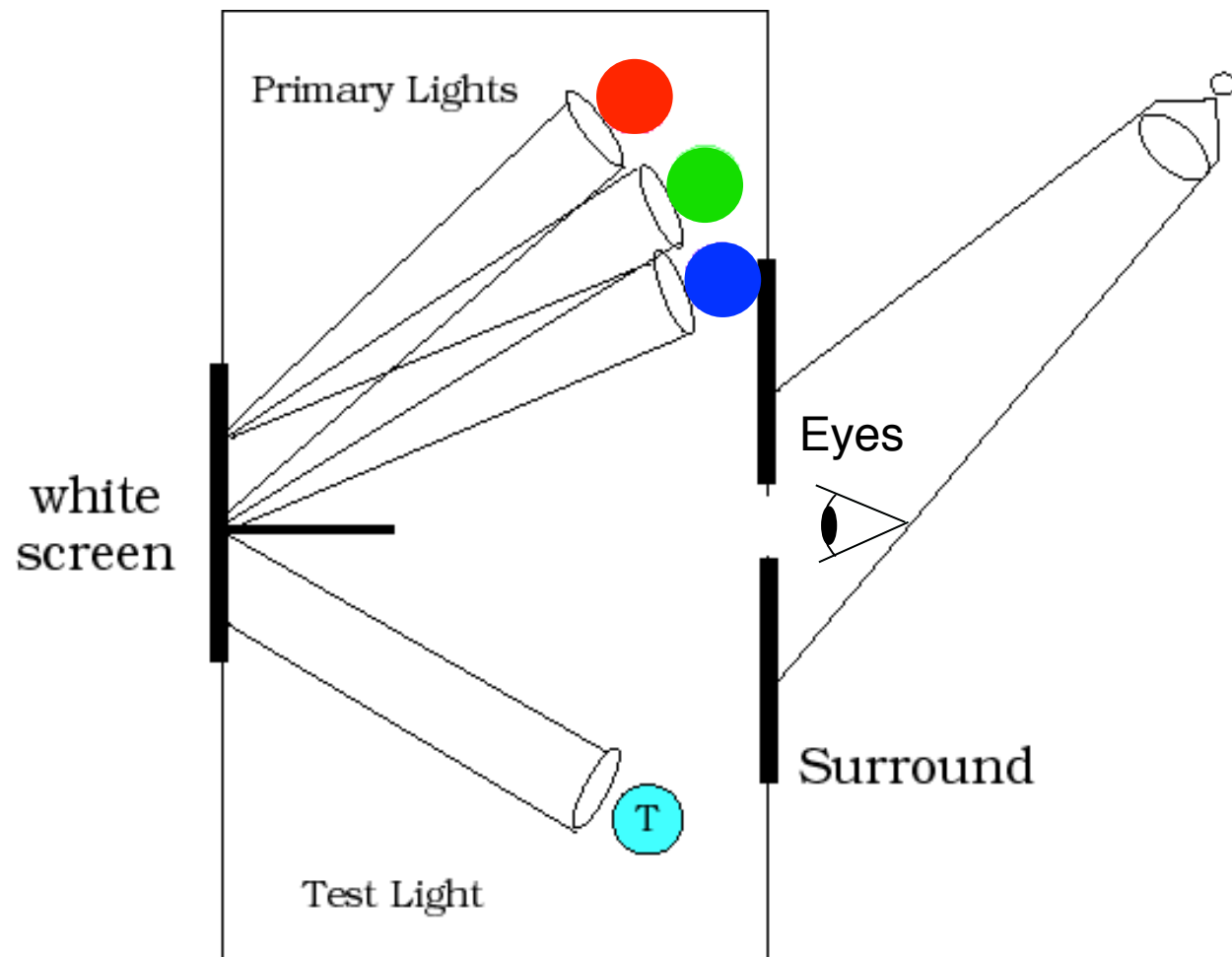
$$\text{with } K_{i,j} = \int_{\lambda} S_i(\lambda) P_j(\lambda) d\lambda$$

**Color matching is linear!**

# Additive vs. subtractive color mixing

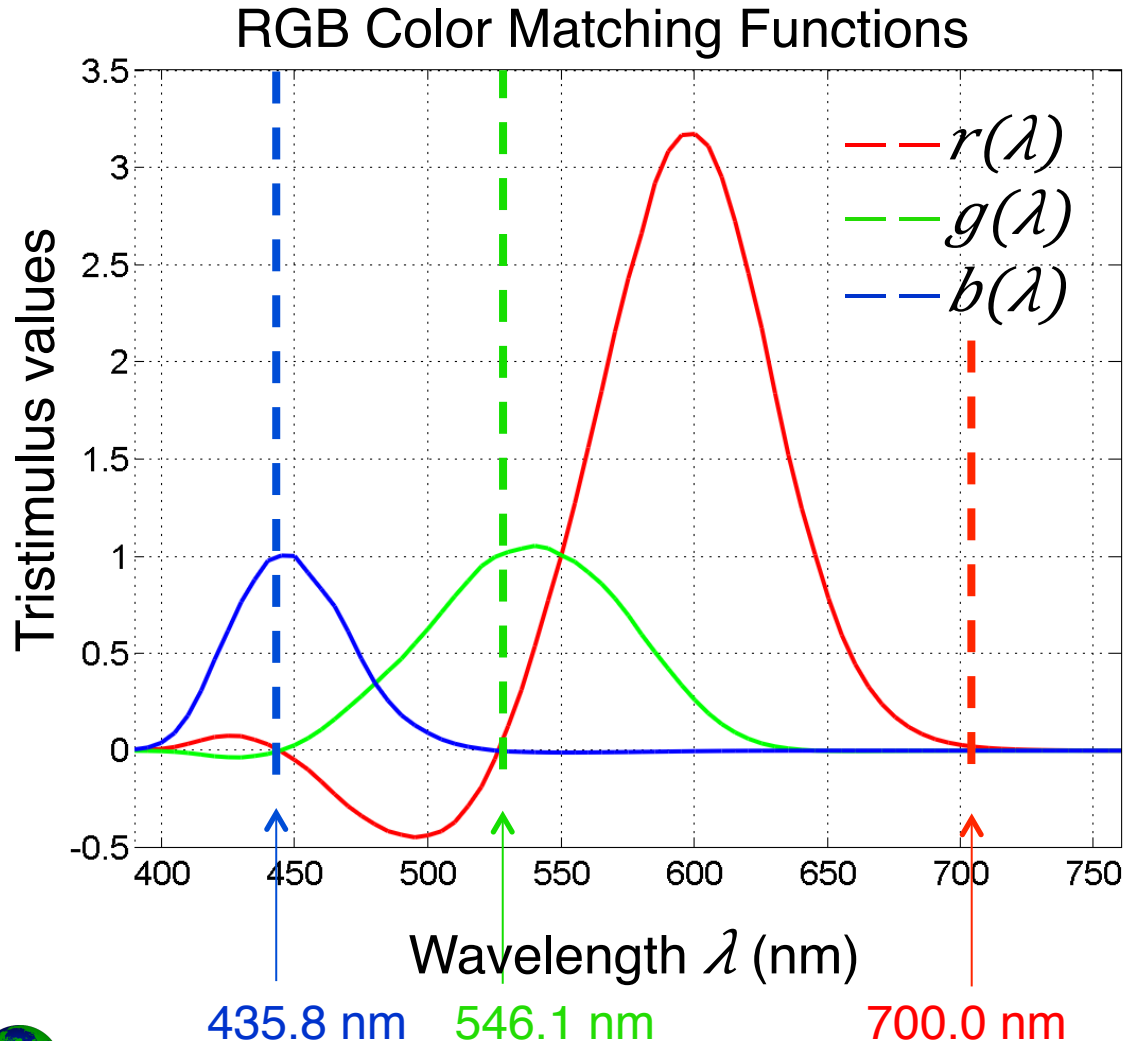


# Color matching experiment



Courtesy B. Wandell, from [Foundations of Vision, 1996]

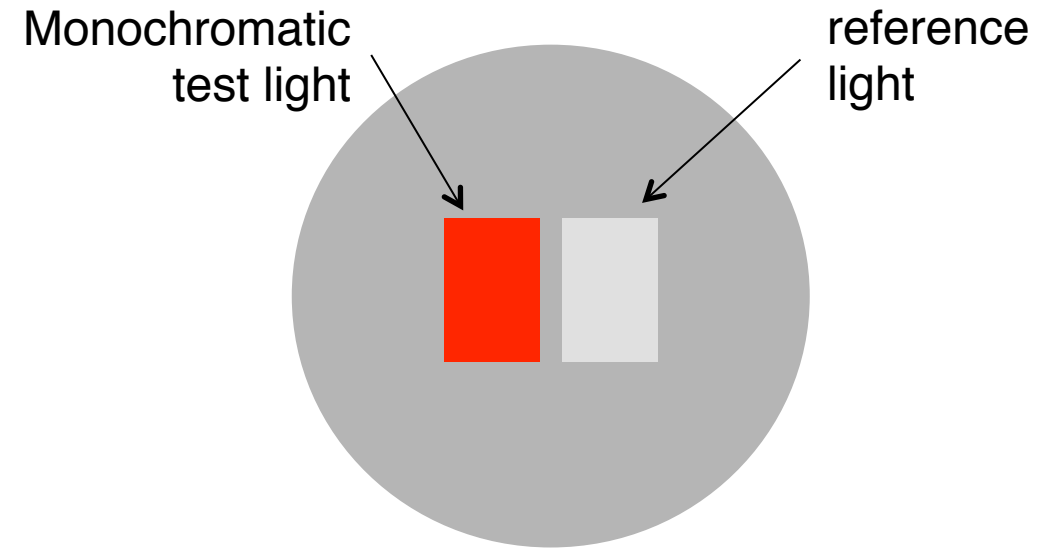
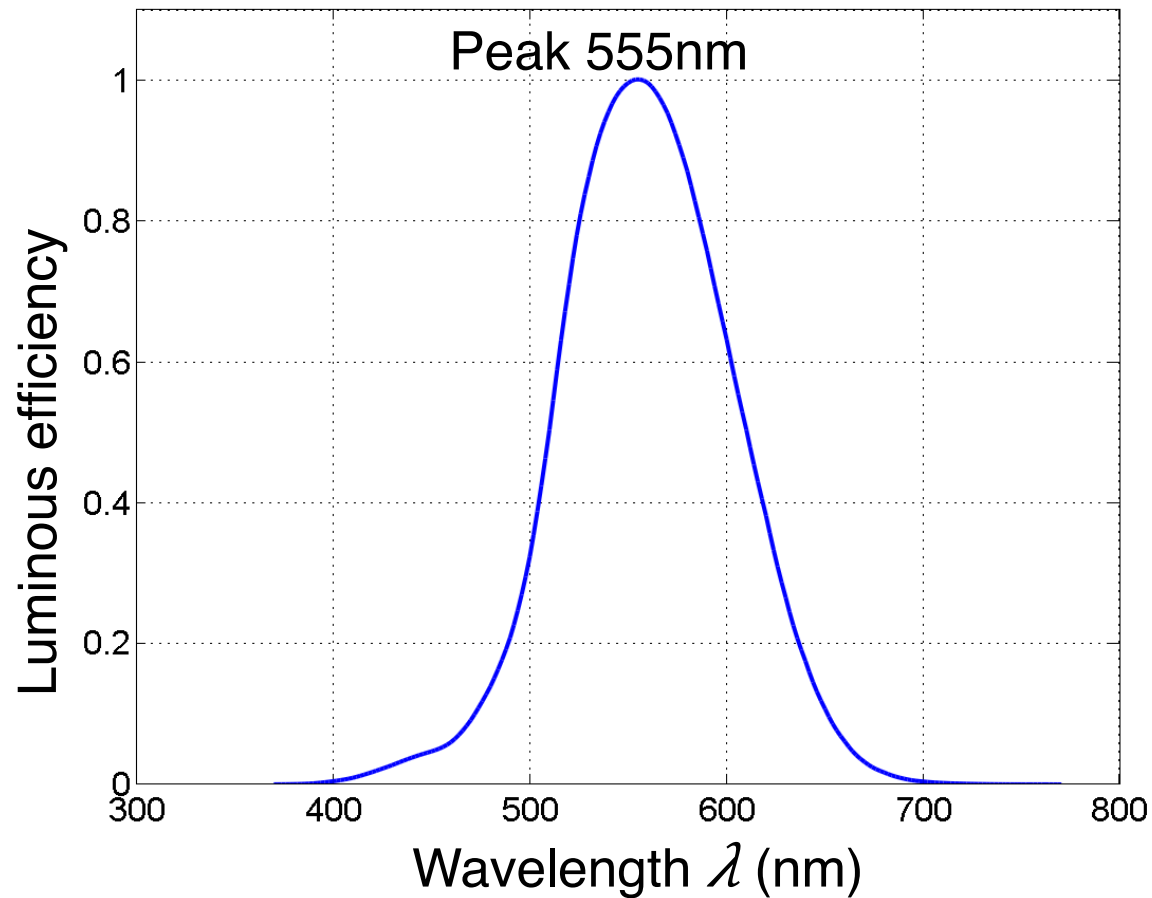
# Spectral matching functions



- Color matching experiment: Monochromatic test light and monochromatic primary lights
- Spectral RGB primaries (scaled, such that  $R_\lambda = G_\lambda = B_\lambda$  matches spectrally flat white).
- “Negative intensity”: color is added to test color
- Standard human observer: CIE (Commision Internationale de L’Eclairage), 1931.



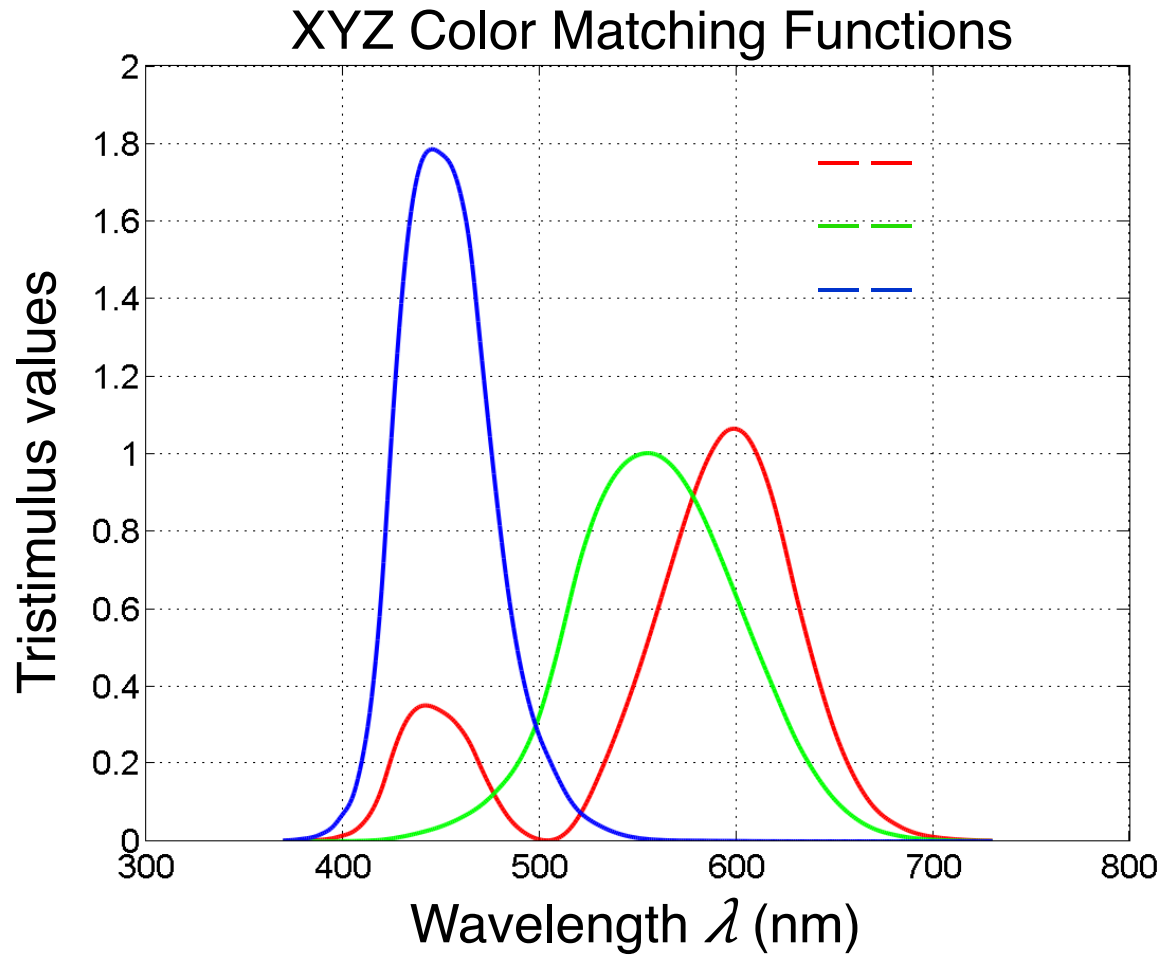
# Luminosity function



- Experiment:  
Match the brightness of a white reference light and a monochromatic test light of wavelength  $\lambda$
- Links photometric to radiometric quantities



# CIE 1931 XYZ color system



## Properties:

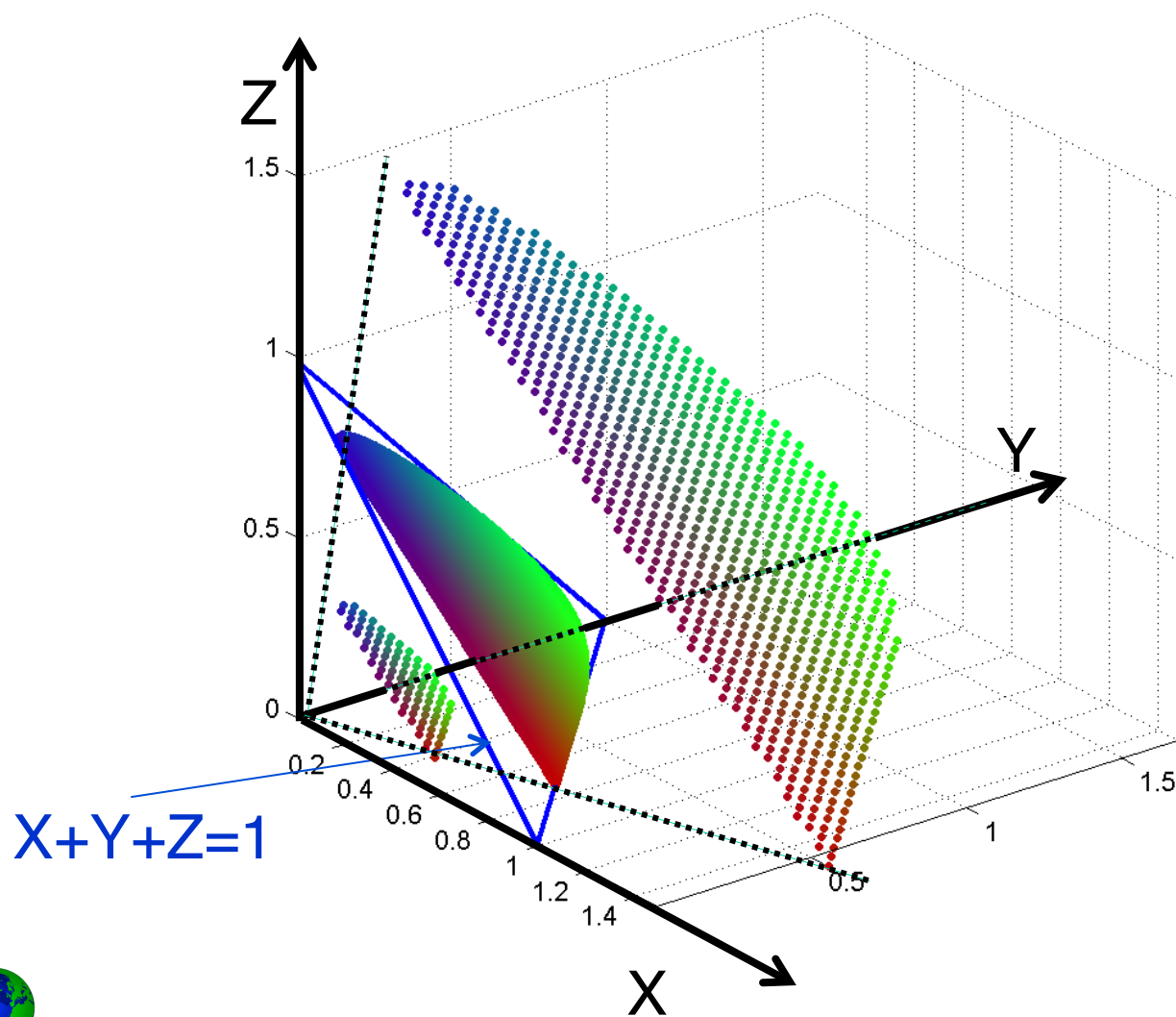
- All positive spectral matching functions

$$\begin{pmatrix} X \\ Y \\ Z \end{pmatrix} = \begin{pmatrix} .490 & .310 & .200 \\ .177 & .813 & .011 \\ .000 & .010 & .990 \end{pmatrix} \begin{pmatrix} R_{\lambda} \\ G_{\lambda} \\ B_{\lambda} \end{pmatrix}$$

- Y corresponds to luminance
- Equal energy white:  $X=Y=Z$
- Virtual primaries



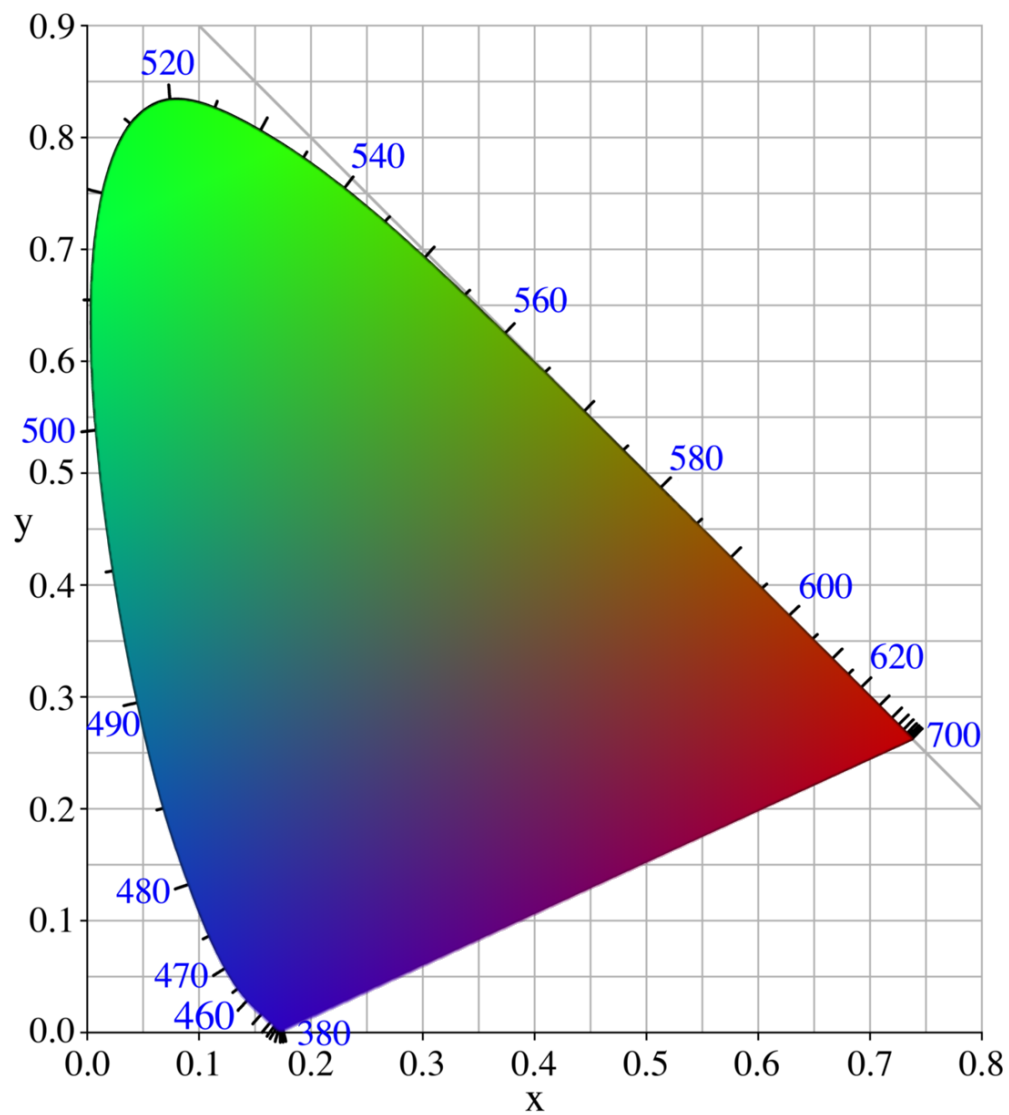
# Color gamut and chromaticity



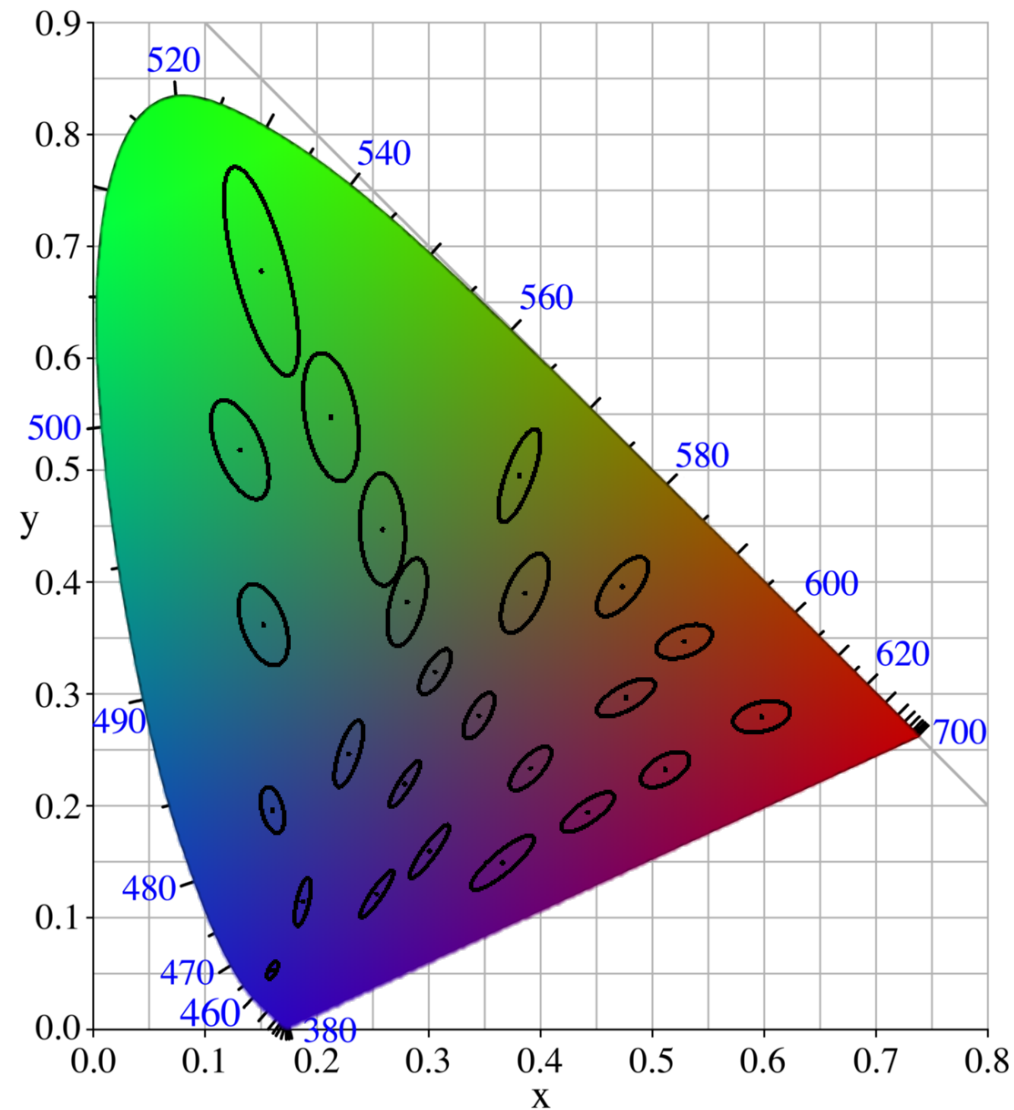
$$x = \frac{X}{X + Y + Z}$$
$$y = \frac{Y}{X + Y + Z}$$



# CIE chromaticity diagram



# Perceptual non-uniformity of xy chromaticity

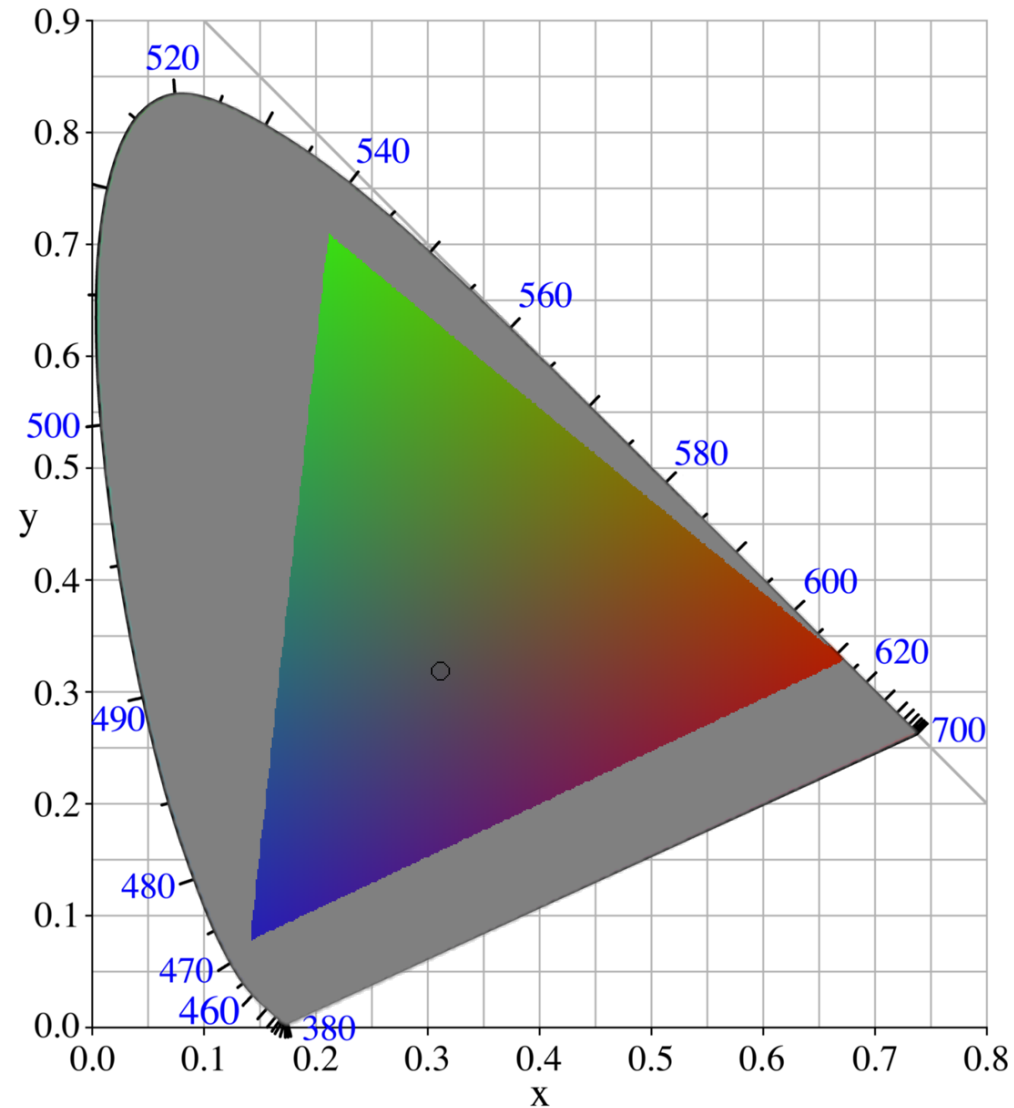


Just noticeable chromaticity differences (10X enlarged)

*[MacAdam, 1942]*



# Color gamut



NTSC phosphors

R:  $x=0.67$ ,  $y=0.33$

G:  $x=0.21$ ,  $y=0.71$

B:  $x=0.14$ ,  $y=0.08$

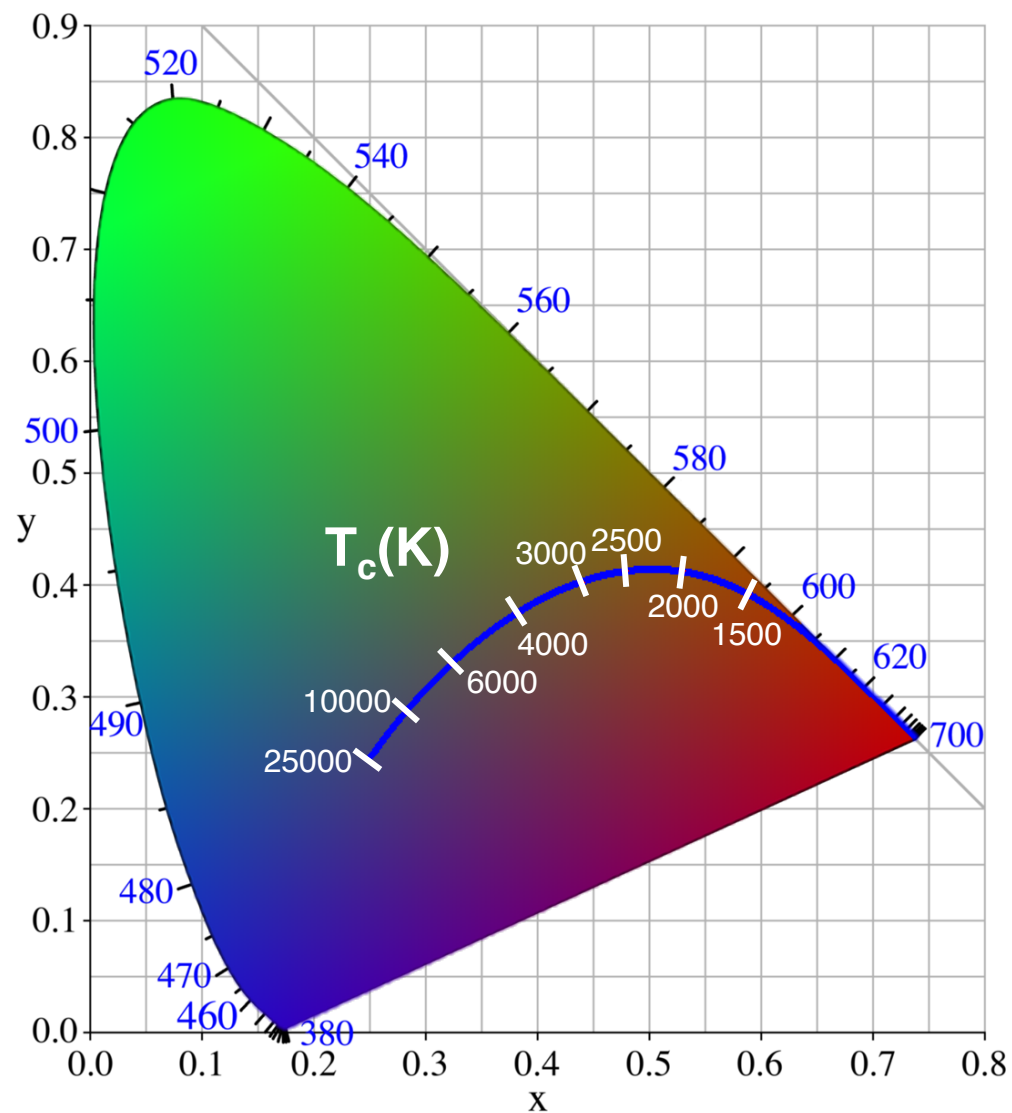
Reference white:

$x=0.31$ ,  $y=0.32$

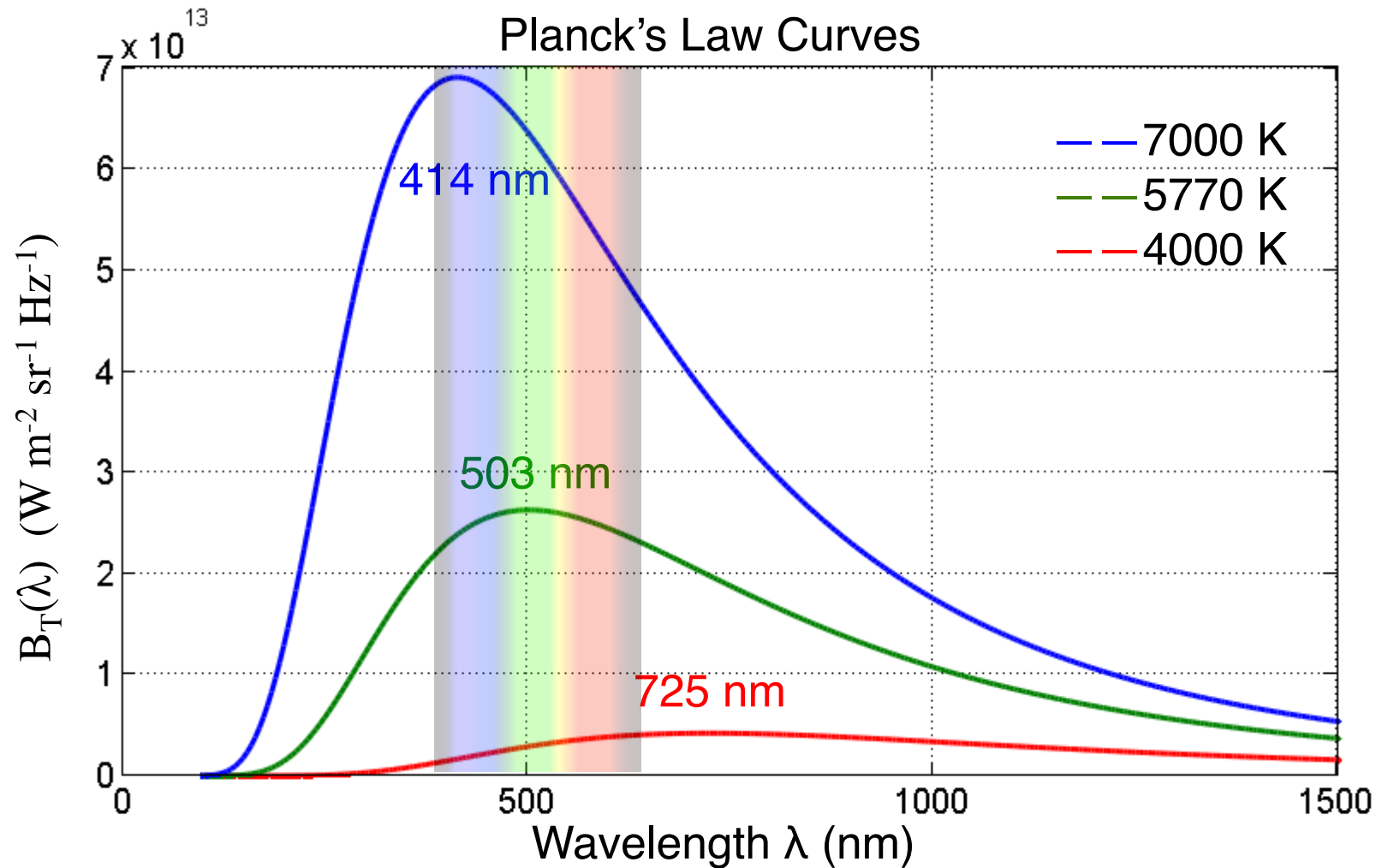
Illuminant C



# White at different color temperatures



# Blackbody radiation



*Planck's Law, 1900*

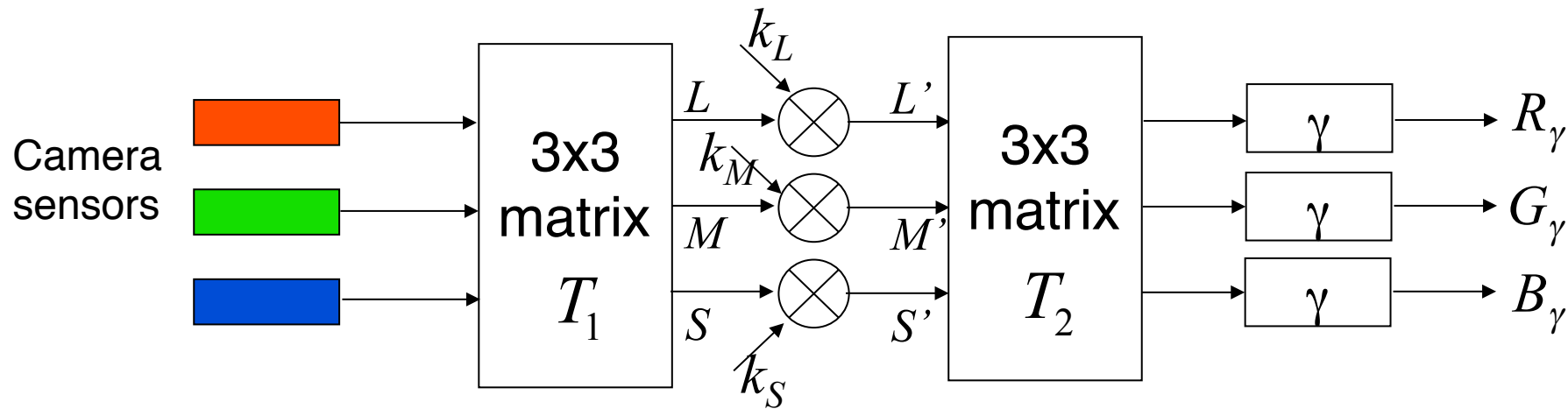
$$B_T(\lambda) = \frac{2hc^2 / \lambda^5}{e^{hc/\lambda kT} - 1}$$

*Wien's Law*

$$\lambda_{peak} [nm] = \frac{2,900,000}{T[K]}$$

# Color balancing

- Effect of different illuminants can be cancelled only in the spectral domain (impractical)
- Color balancing in 3-d color space is practical approximation
- Color constancy in human visual system: gain control in cone space LMS [[von Kries, 1902](#)]
- Von Kries hypothesis applied to image acquisition devices (cameras, scanners)



- How to determine  $k_L$ ,  $k_M$ ,  $k_S$  automatically?

# Color balancing (cont.)

- Von Kries hypothesis

$$\begin{pmatrix} L' \\ M' \\ S' \end{pmatrix} = \begin{pmatrix} k_L & 0 & 0 \\ 0 & k_M & 0 \\ 0 & 0 & k_S \end{pmatrix} \begin{pmatrix} L \\ M \\ S \end{pmatrix}$$

- If illumination (or a patch of white in the scene) is known, calculate

$$k_L = \frac{L_{desired}}{L_{actual}}; \quad k_M = \frac{M_{desired}}{M_{actual}}; \quad k_S = \frac{S_{desired}}{S_{actual}}$$

# Color balancing with unknown illumination

- Gray-world

$$k_L \sum_{x,y} L[x,y] = k_M \sum_{x,y} M[x,y] = k_S \sum_{x,y} S[x,y]$$

- Scale-by-max

$$k_L \max_{x,y} L[x,y] = k_M \max_{x,y} M[x,y] = k_S \max_{x,y} S[x,y]$$

- Shades-of-gray  
*[Finlayson, Trezzi, 2004]*

$$k_L \left( \sum_{x,y} L^p[x,y] \right)^{\frac{1}{p}} = k_M \left( \sum_{x,y} M^p[x,y] \right)^{\frac{1}{p}} = k_S \left( \sum_{x,y} S^p[x,y] \right)^{\frac{1}{p}}$$

- » Special cases: gray-world ( $p = 1$ ), scale-by-max ( $p = \infty$ )
- » Best performance for  $p \approx 6$

- Refinements:  
smooth image, exclude saturated color/dark pixels,  
use spatial derivatives instead (“gray-edge,” “max-edge”)  
*[van de Weijer, 2007]*

# Color balancing example



Original



Gray-world



Scale-by-max



Gray-edge



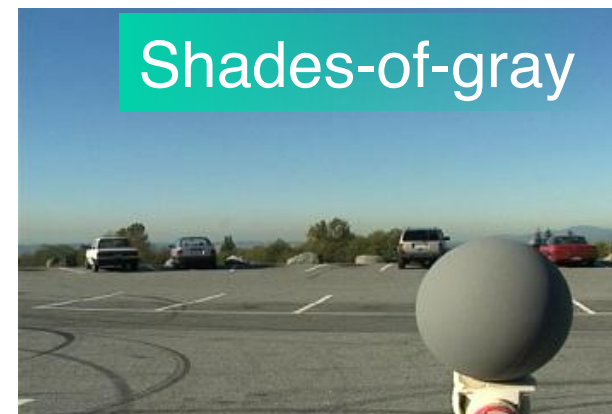
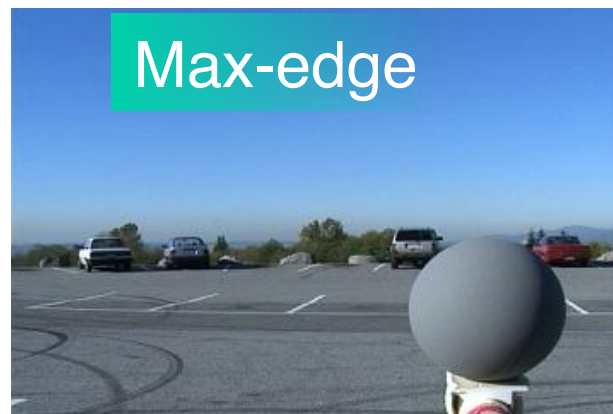
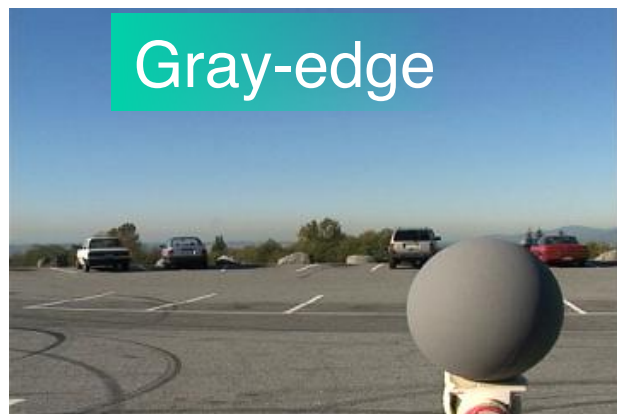
Max-edge



Shades-of-gray

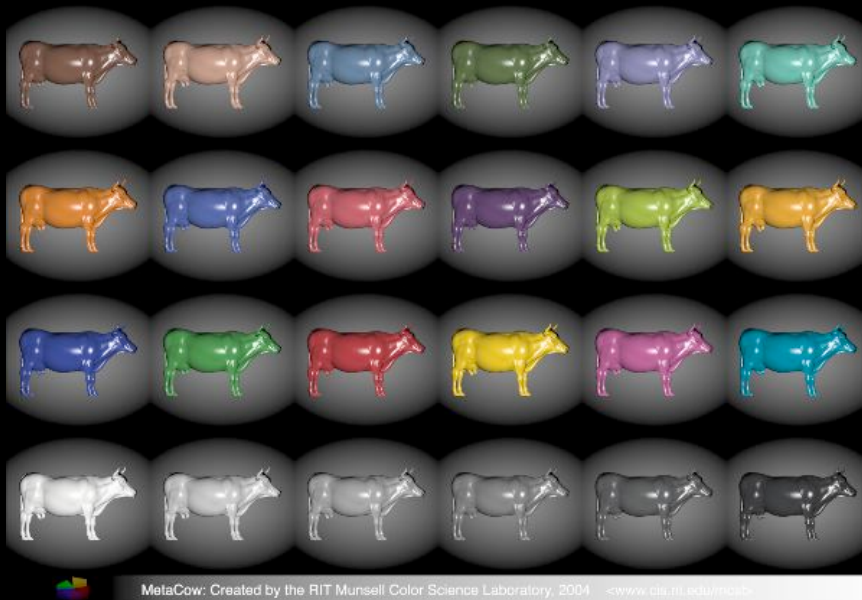


# Color balancing example

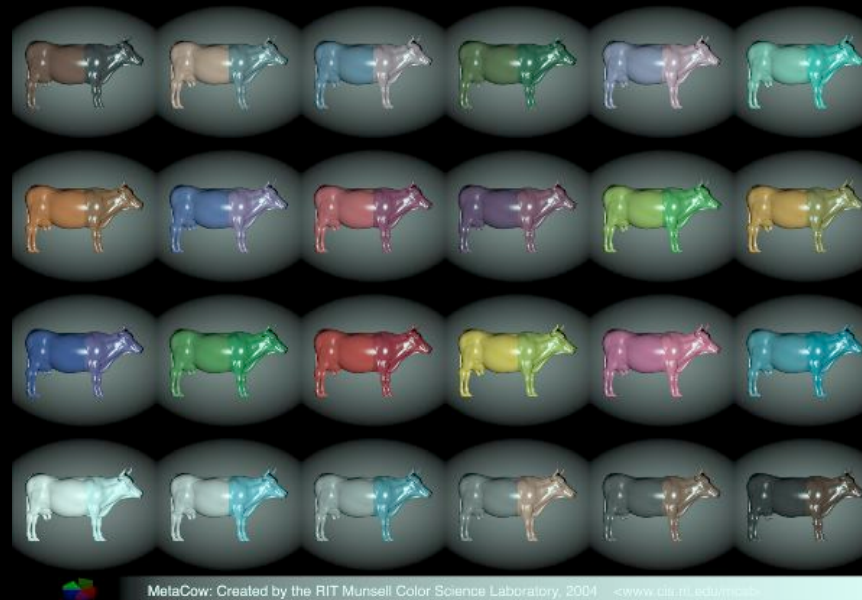


Original image courtesy Ciurea and Funt

Daylight D65  
CIE observer



Daylight D65  
cheap camera



Illuminant A  
CIE observer

