

# Color image processing

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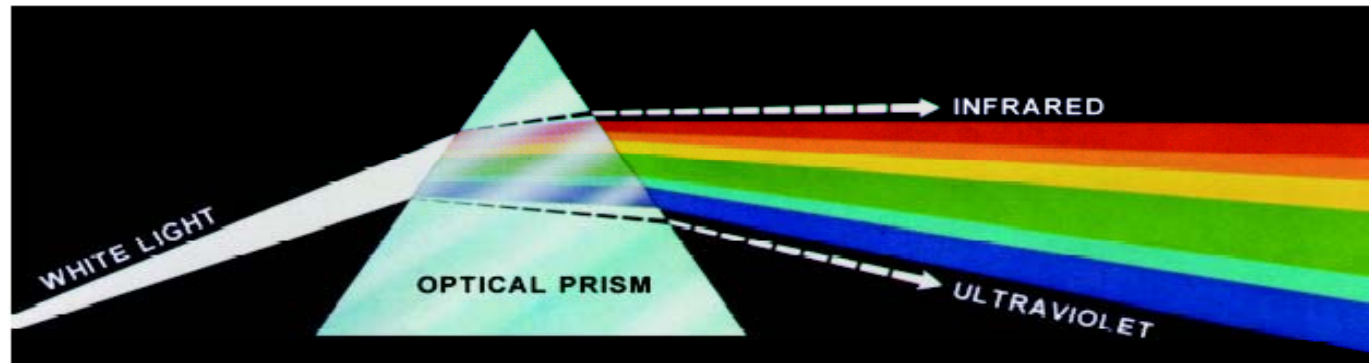
# Introduction

- In automated image analysis, color is a powerful descriptor, which simplifies object identification and extraction.
- The human eye can distinguish between thousands of color shades and intensities but only about 20-30 shades of gray. Hence, use of color in human image processing would be very effective.
- Color image processing
  - Pseudo-color processing
  - Full-color processing.

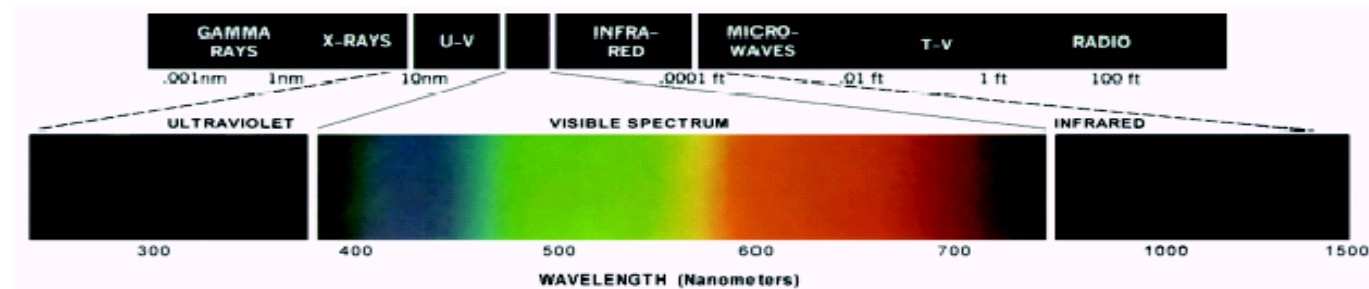
# Color Fundamentals

- When a beam of sunlight is passed through a glass prism, the emerging beam of light is not white but consists of a continuous spectrum of colors (Sir Isaac Newton, 1666).
- The different colors (violet, blue, green, yellow, orange, and red) in the spectrum do not end abruptly but each color blends smoothly into the next.

# Color spectrum



**FIGURE 6.1** Color spectrum seen by passing white light through a prism. (Courtesy of the General Electric Co., Lamp Business Division.)

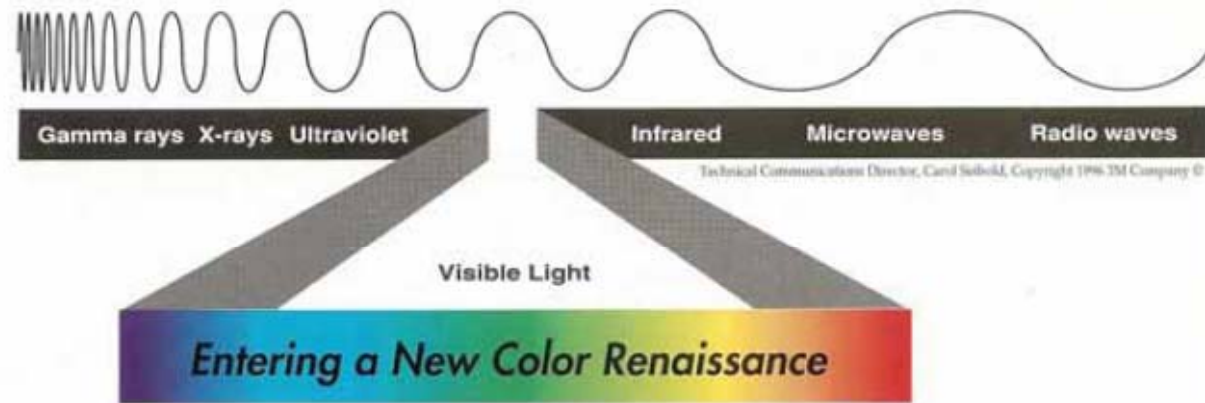


**FIGURE 6.2** Wavelengths comprising the visible range of the electromagnetic spectrum. (Courtesy of the General Electric Co., Lamp Business Division.)

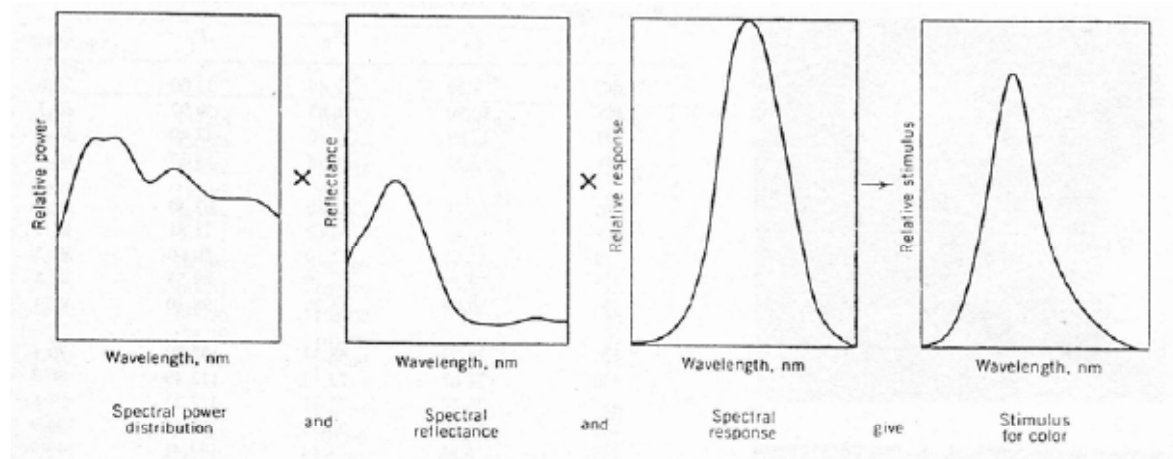
# Color Fundamentals

- Light that is relatively balanced in all visible wavelengths is perceived as white.
  - Achromatic
  - Gray scale
  - Chromatic light spans the electromagnetic (EM) spectrum from approximately 400 nm to 700 nm.
- Color perceived by the human eye depends on the nature of light reflected by an object.
  - Objects that appear green reflect more light in the 500-570 nm range (absorbing other wavelengths of light).

# Color perception



**Wavelength between 380nm to 780nm**



**Light source**

**Reflectance**

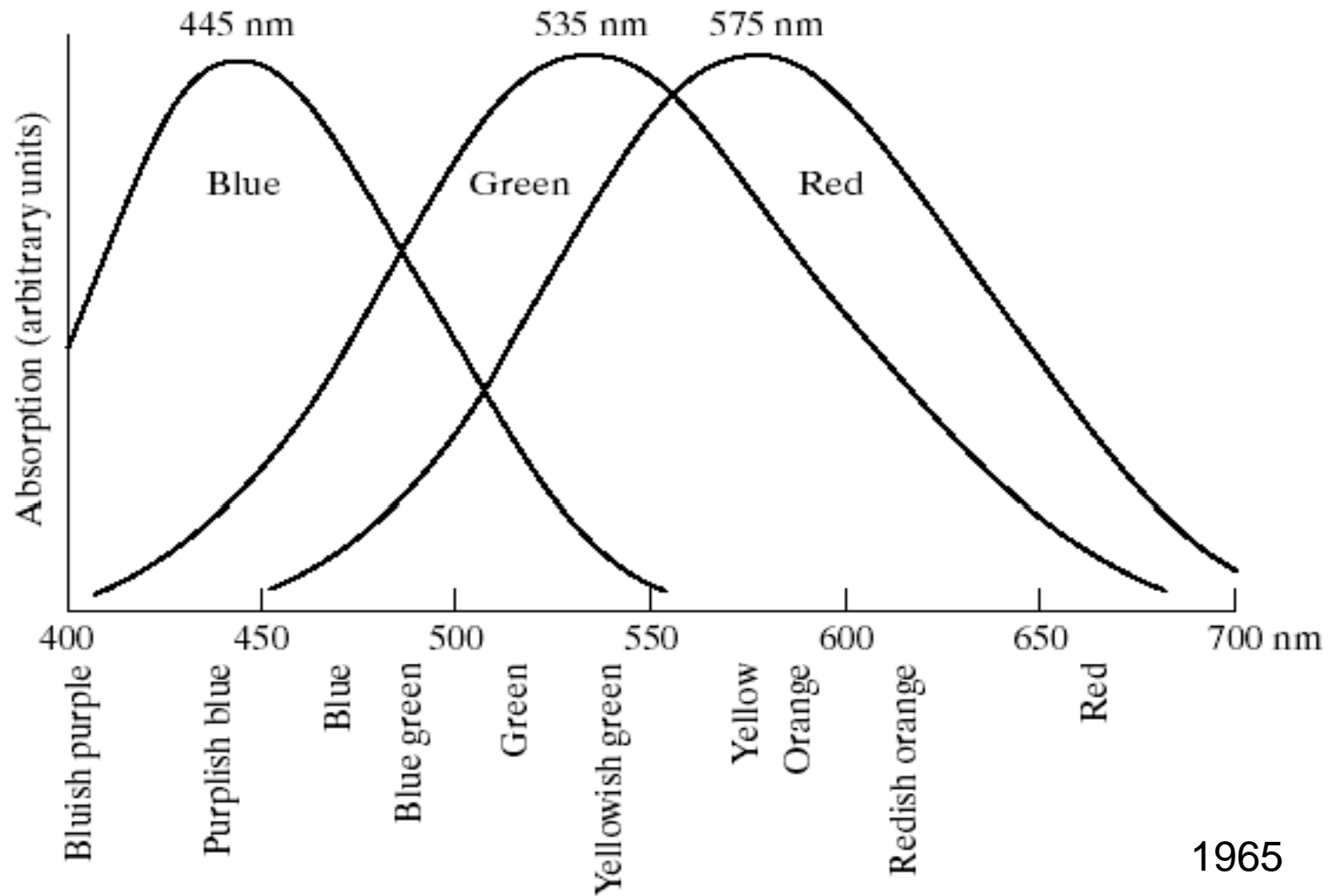
**Eye's Responsivity**

**Color**

# Human eyes v.s. color image

- Cones in the retina are responsible for color perception in the human eye.
- Six to seven million cones in the human eye can be divided into three categories: red light sensitive cones (65%), green light sensitive cones (33%) and blue light sensitive cones (2%). The latter cones are the most sensitive ones.
  - Three primary colors: RGB

# Absorption of light by cones



1965

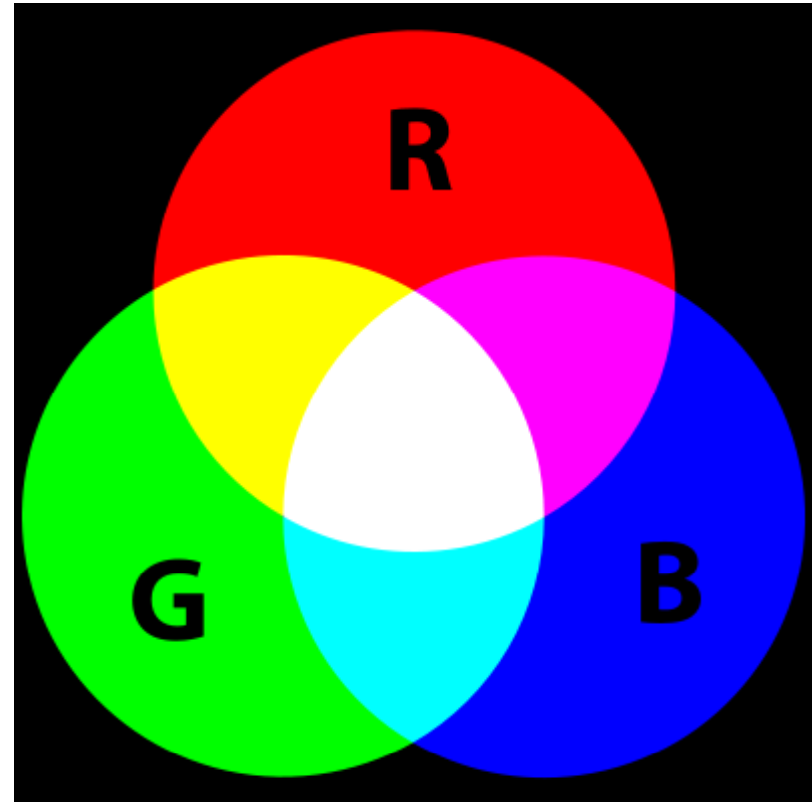


# Standardization: CIE primary colors

- Red (R) (700 nm)  
Green (G) (546.1 nm)  
Blue (B) (435.8 nm)
- The wavelengths for the three primary colors are established by standardization by the CIE (International Commission on Illumination) in 1931. (only approximately correspond to the experimental curves in last slide)

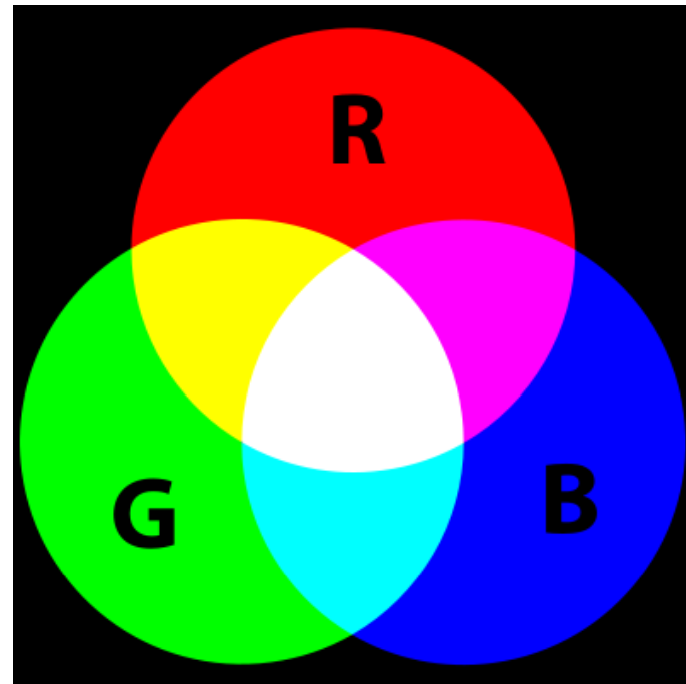
# Primary and secondary colors

- Primary colors are added to produce secondary colors:
  - Magenta (red + blue)
  - Cyan (green + blue)
  - Yellow (red + green)

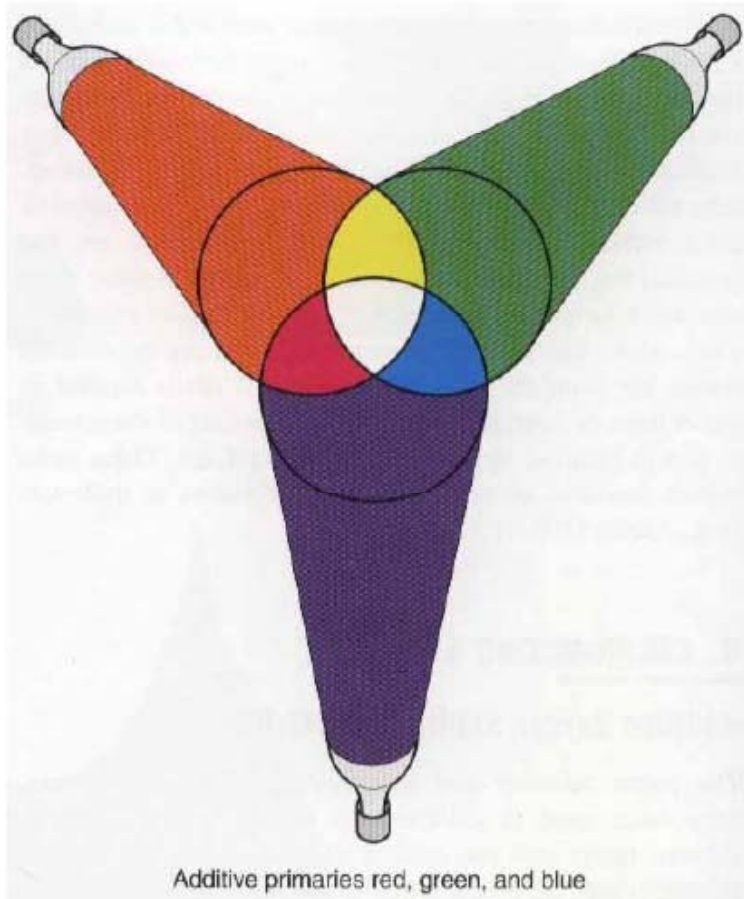


# Additive color mixing

- Mixing the three primaries, or a secondary with its opposite primary, in the right intensities produces white light.
- Mixture of lights
  - TV, computer monitor

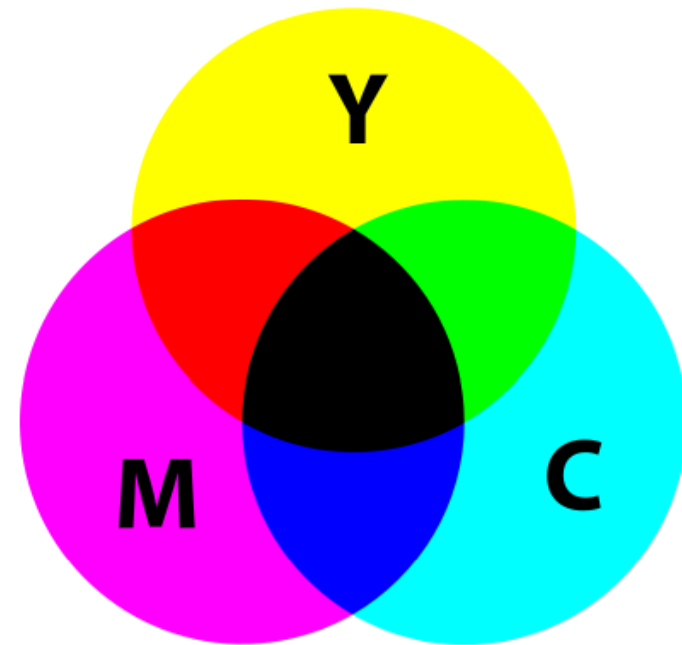


# Color mixing



# Subtractive color mixing

- The primary colors of pigments are magenta, cyan, and yellow, and the secondary pigment colors are red, green, and blue.
- Mixture of pigments
  - Printer



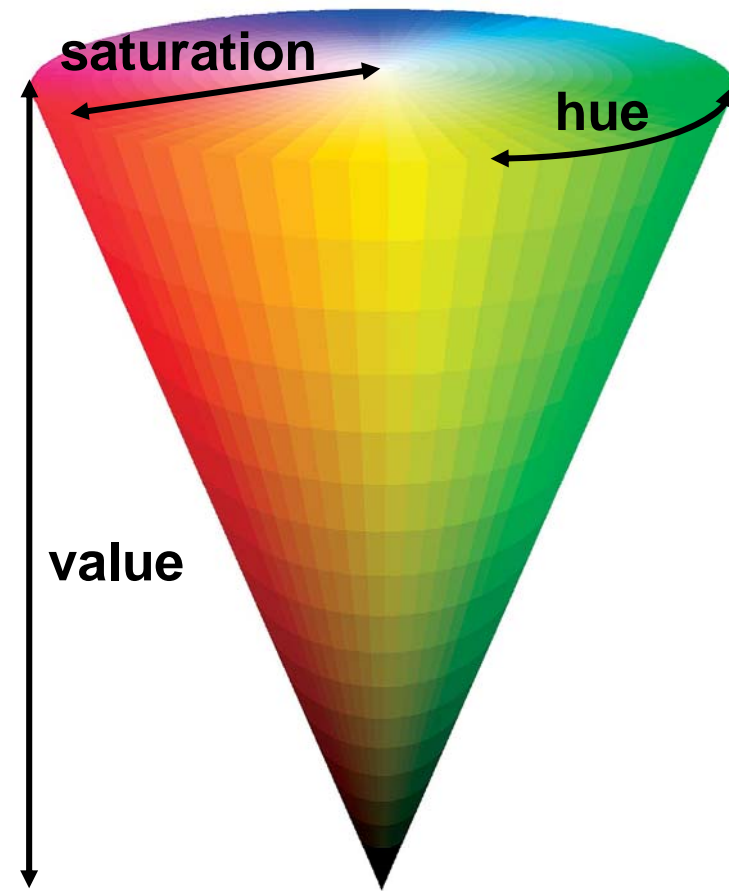
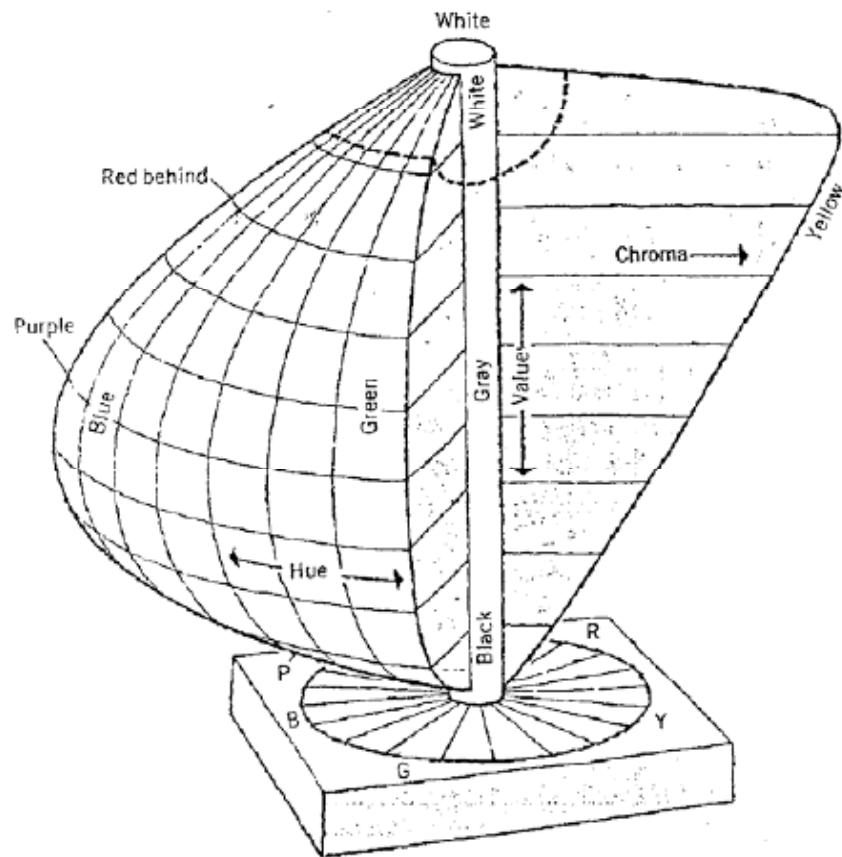
# Characteristics of Color

- **Brightness (Intensity, value)**
  - embodies the chromatic notion of intensity.
- **Hue**
  - is an attribute associated with the dominant wavelength in a mixture of light waves. It represents the dominant color as perceived by an observer (ex. orange, red, violet).

# Characteristics of Color

- **Saturation (chroma)**
  - refers to the relative purity or the amount of white light mixed with a hue.
  - Pure colors are fully saturated.
  - Colors such as pink (red + white) and lavender (violet + white) are less saturated, with the saturation being inversely proportional to the amount of white light added.

# Hue, Saturation, Intensity



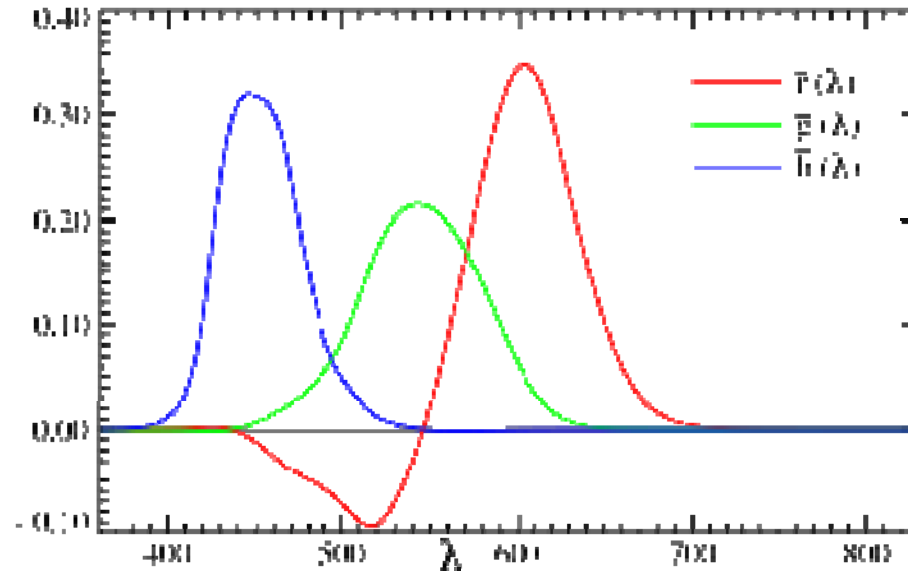


# CIE RGB color space

- The amounts of red, green, and blue (primary colors) needed to form any particular color are called the **tristimulus values**
  - Red (R): 700 nm  
Green (G): 546.1 nm  
Blue (B): 435.8 nm
  - Can we reproduce single-wavelength EM wave by mixing these three primary colors?

# RGB matching function

The CIE RGB Color matching functions



- Given these functions, the RGB tristimulus values for a color with a spectral power distribution  $I(\lambda)$  can be obtained by:

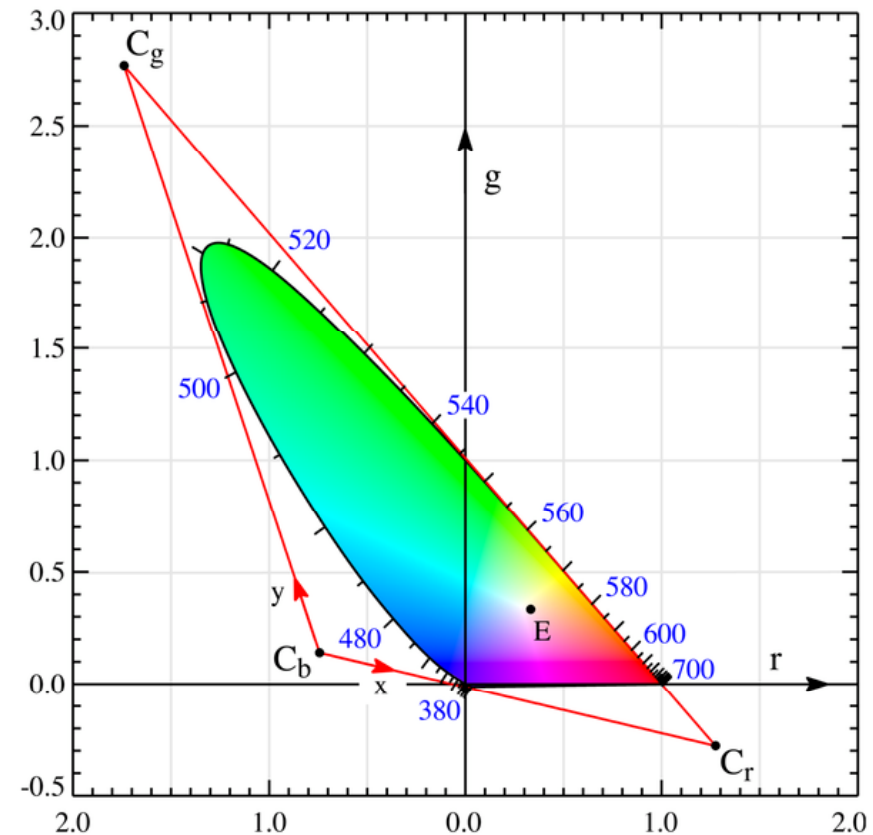
$$R = \int I(\lambda)\bar{r}(\lambda)d\lambda \quad G = \int I(\lambda)\bar{g}(\lambda)d\lambda \quad B = \int I(\lambda)\bar{b}(\lambda)d\lambda$$

# CIE rg chromaticity diagram

- The chromaticity diagram can be used for color mixing, since a line joining two points in the diagram represents all the colors that can be obtained by mixing the two colors additively.

$$r = \frac{R}{R+G+B}$$

$$g = \frac{G}{R+G+B}$$



# XYZ color space

- A new color space ( $XYZ$ , which are roughly red, green, and blue) was developed so that

- Positive color matching functions:

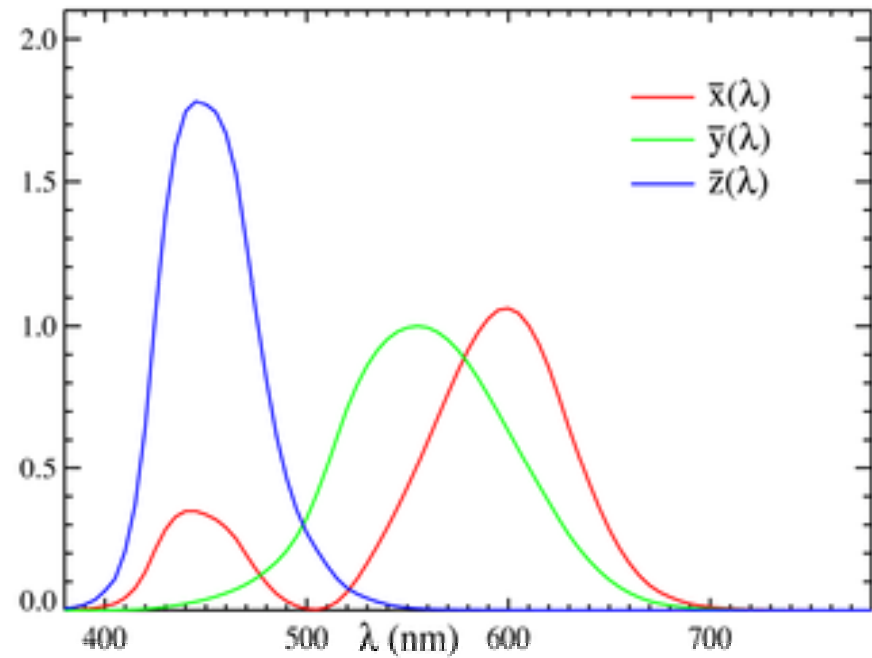
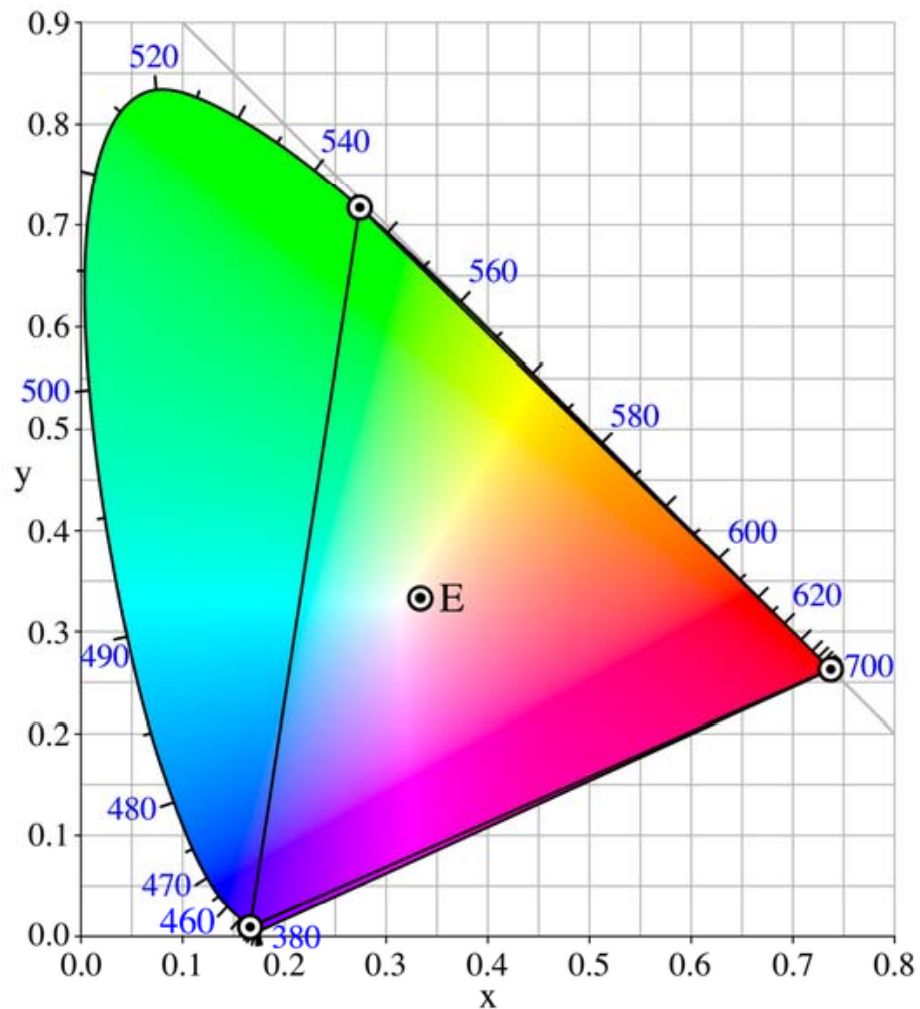
$$X = \int I(\lambda) \bar{x}(\lambda) d\lambda \quad Y = \int I(\lambda) \bar{y}(\lambda) d\lambda \quad Z = \int I(\lambda) \bar{z}(\lambda) d\lambda$$

- Three trichromatic coefficients

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

- White point:  $x = y = z = 0.333$

# CIE xy chromaticity diagram



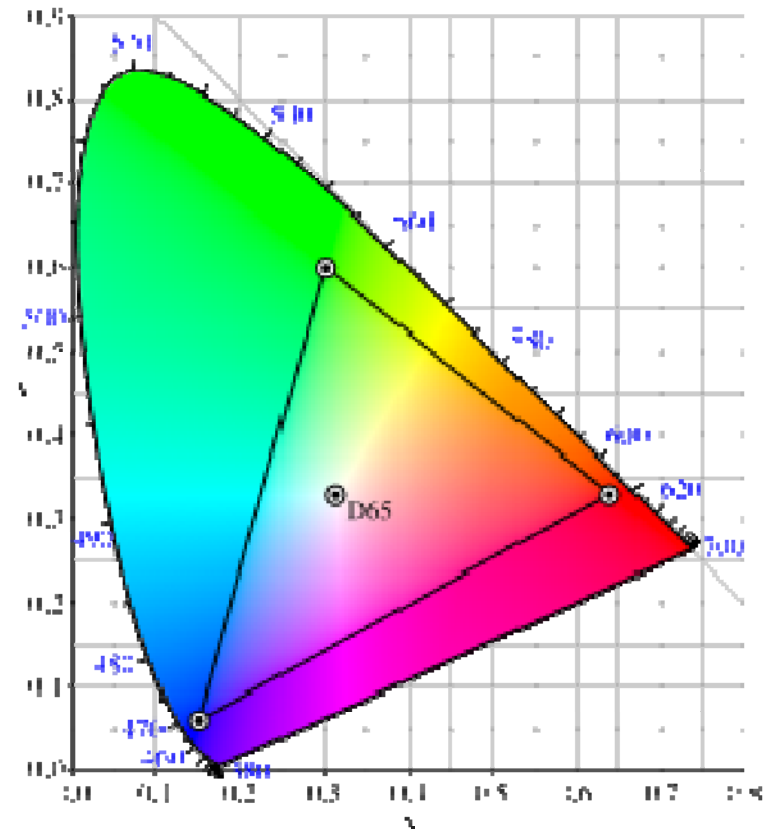
The CIE 1931 standard observer  
Color matching functions

# Chromaticity diagram

- The triangular region in the chromaticity diagram represents all the colors that can be obtained by combining the three primary colors.
  - Color gamut produced by three colors
  - The gamut of human vision is not a triangle

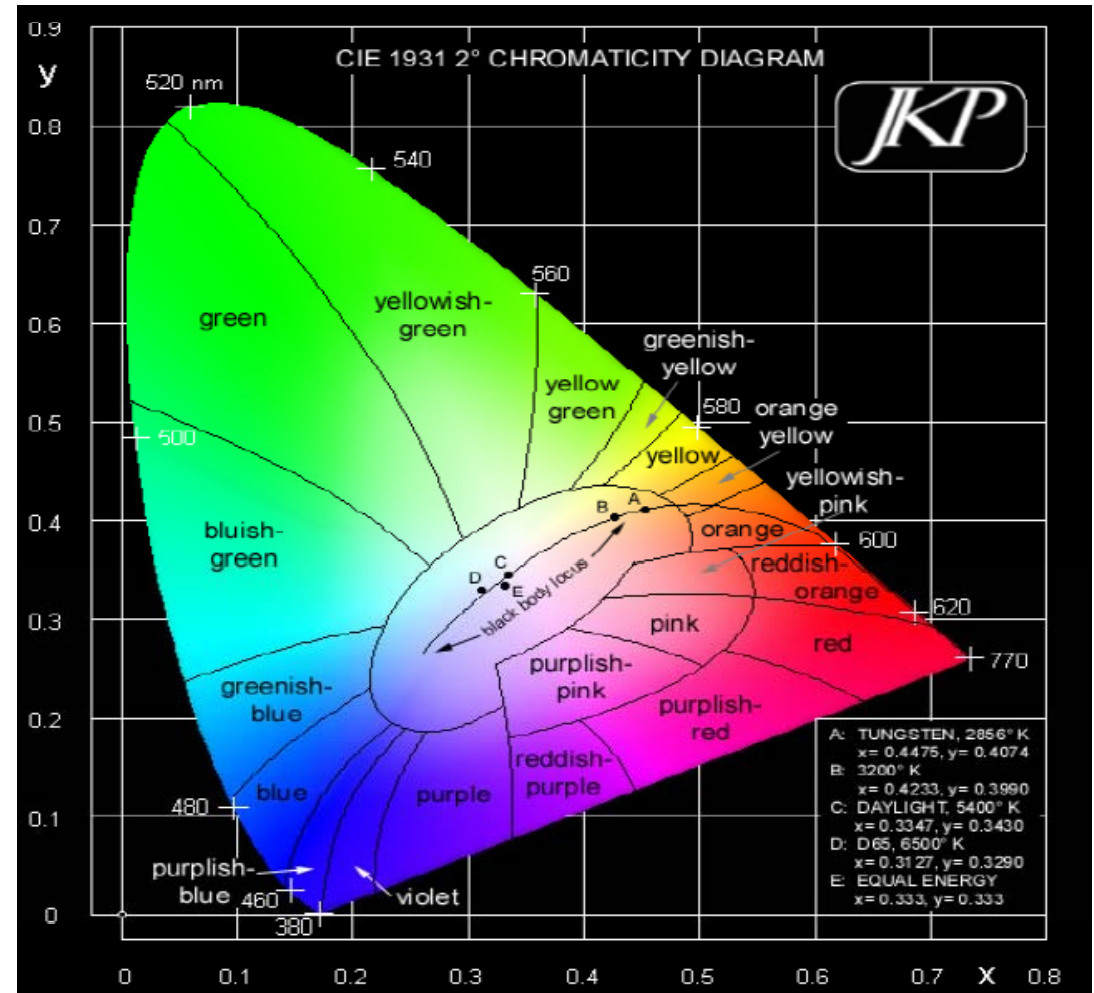
# Standard RGB (sRGB) space

- Created by HP and Microsoft in 1996 for use on monitors, printers, and the internet.
- Areas outside the triangle cannot be accurately colored, because they are out of the gamut of computer displays.



# CIE Chromaticity diagram

- Boundary: completely saturated or “pure” colors (or the light with single wavelength)
- Inside the tongue-shaped region: mixture of the pure colors.





# Color models

# Color Models

- The purpose of a color model (or color space or color system) is to facilitate the specification of color in some standard fashion.
- A color model is a specification of a 3-D coordinate system and a subspace within that system where each color is represented by a single point.

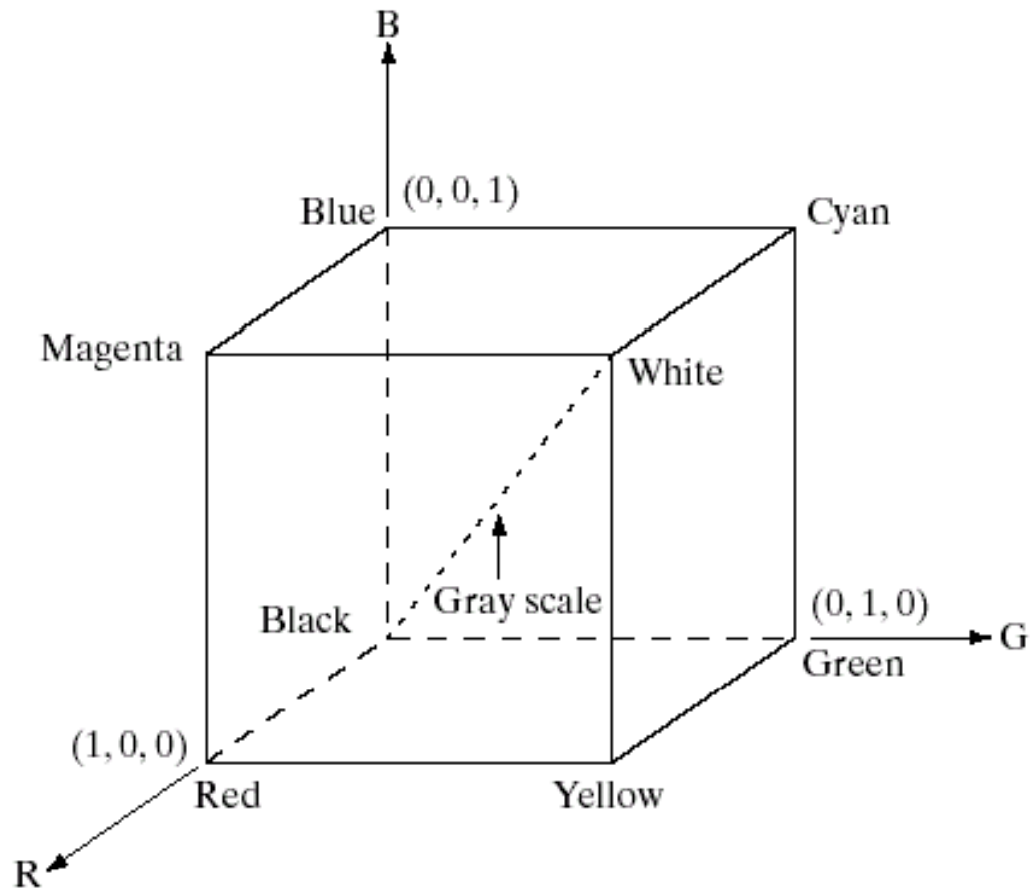
# Color Models

- In image processing, the hardware based color models mainly used are: RGB, CMYK, and HSI.
- **RGB** (red, green, blue) color system
  - mainly in color monitors and video cameras.
- **CMYK** (cyan, magenta, yellow, black)
  - is used in printing devices.
- **HSI** (hue, saturation, intensity)
  - based on the way humans describe and interpret color.
  - It also helps in separating the color and grayscale information in an image.

# RGB Color model

- Each color appears in its primary spectral components of red, green, and blue.
- It is based on a Cartesian coordinate system. All color values are normalized so that the values of  $R$ ,  $G$ , and  $B$  are in the range  $[0,1]$ . Thus, the color subspace of interest is the unit cube.

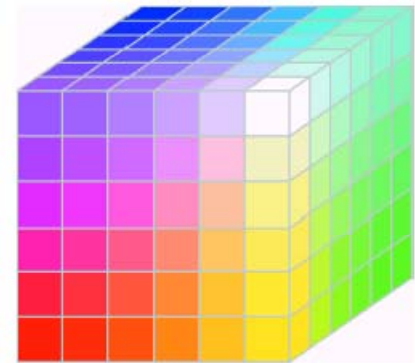
# RGB Color model



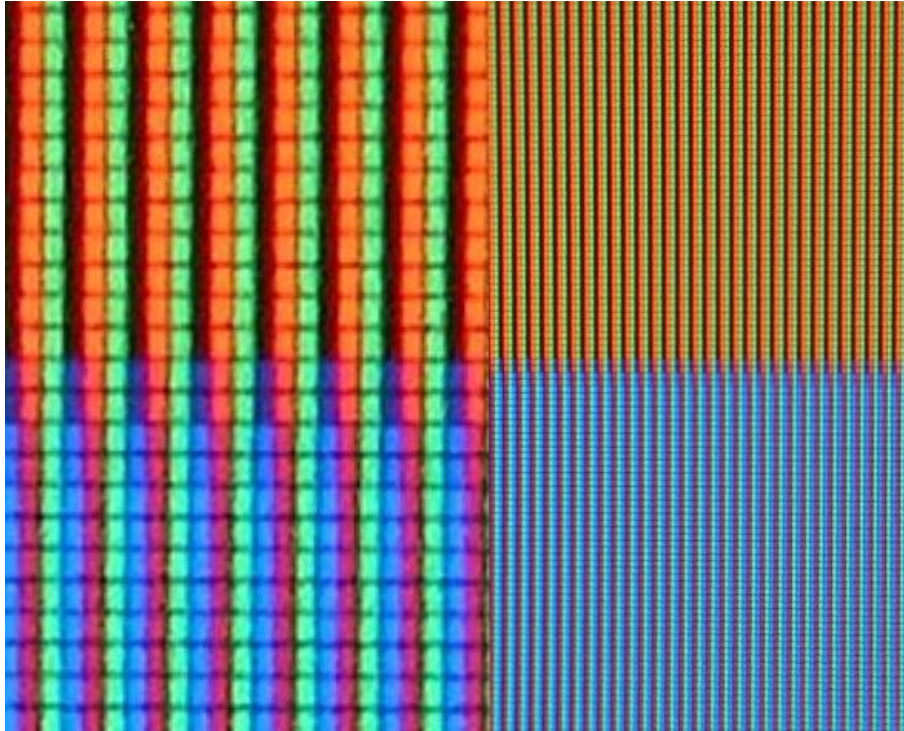
24-bit RGB color cube

# RGB Color model

- Images in the RGB model consist of three independent component images, one for each primary color.
- The number of bits used to represent each pixel in RGB space is called *pixel depth*.
  - True color: 24 bits
  - Safe RGB color (safe web color): 216 colors







RGB pixels in an LCD TV

Right: an orange and a blue color

Left: a close-up of pixels



A single pixel in a large scale LED screen composed of red, green, blue LEDs.



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# CMY color model

- Each color is represented by the three secondary colors --- cyan (C), magenta (M), and yellow (Y).
- It is mainly used in devices such as color printers that deposit color pigments.
- It is related to the RGB color model:

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



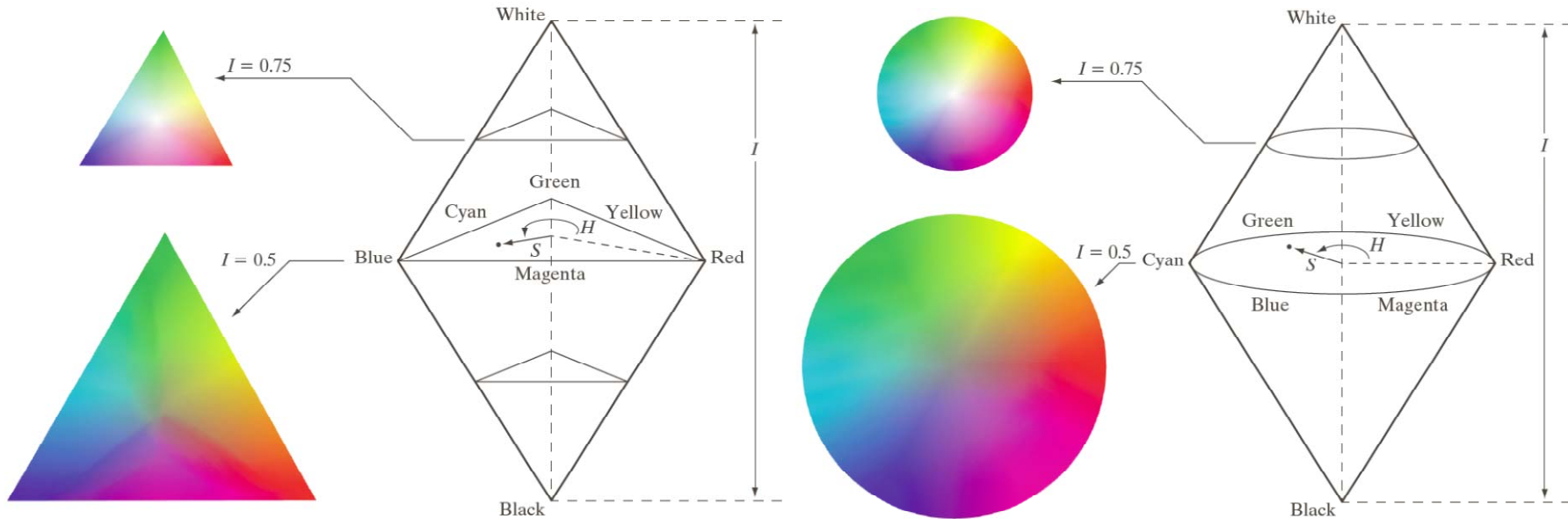
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  - based on the way humans describe and interpret color.
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# HSI or HSV color model

- Each color is specified in terms of its Hue (H), Saturation (S) and intensity (I) or value (V).
- The main advantages of this model is that:
  - Chrominance (H, S) and luminance (I) components are decoupled.
  - Hue and saturation is intimately related to the way the human visual system perceives color.

# HIS color model



$$I = \frac{1}{3}(R + G + B)$$

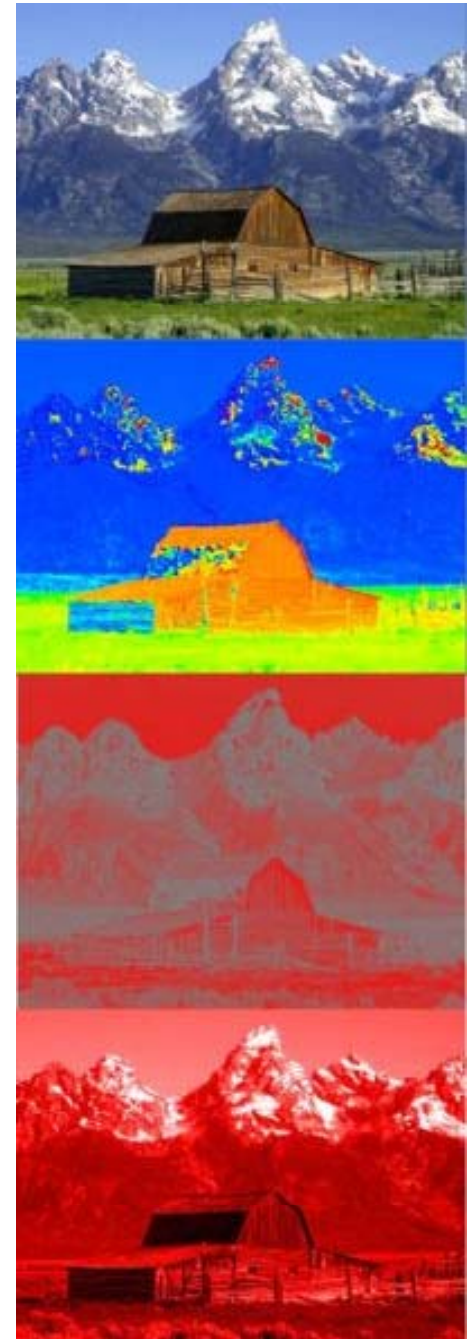
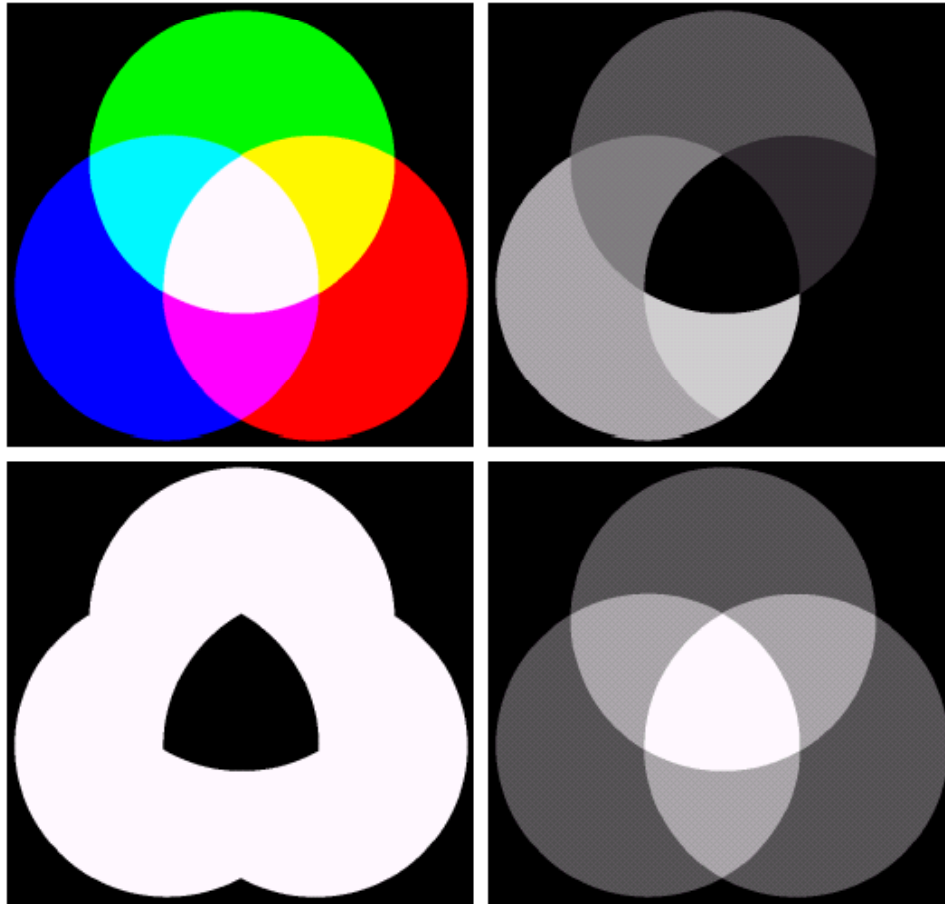
(Assume  $R$ ,  $G$ , and  $B$  are normalized to  $[0, 1]$ .)

$$S = 1 - \frac{3}{(R + G + B)} \cdot \min(R, G, B)$$

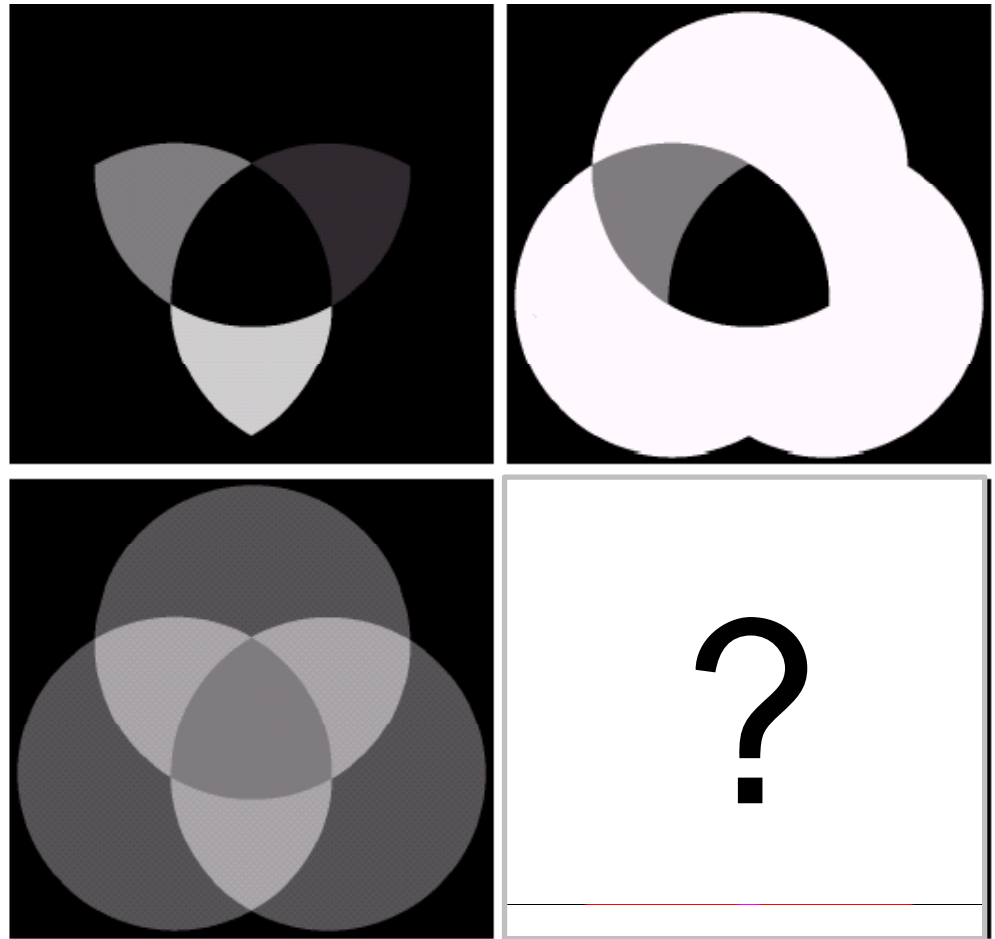
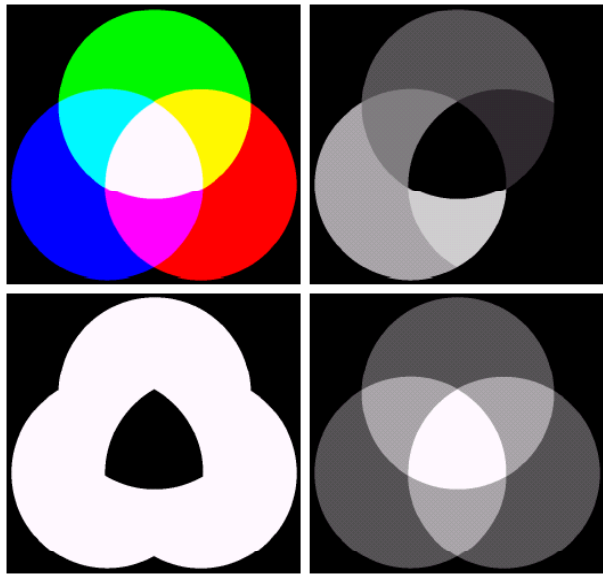
$$H = \begin{cases} \theta & , \text{if } B \leq G \\ 360 - \theta & , \text{else.} \end{cases}$$

$$\theta = \cos^{-1} \left\{ \frac{[(R - G) + (R - B)] / 2}{[(R - G)^2 + (R - B)(G - B)]^{1/2}} \right\}$$

# HIS color model



# What color is it?





# Manipulation of HSI components

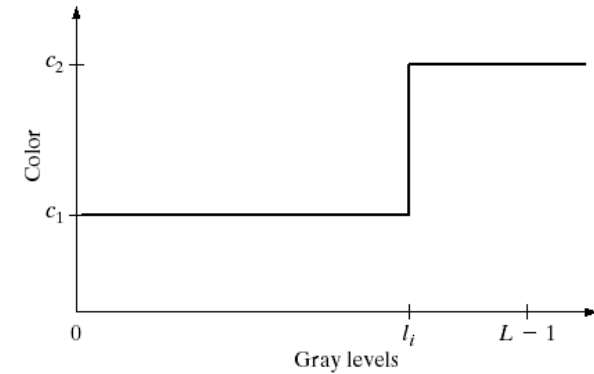
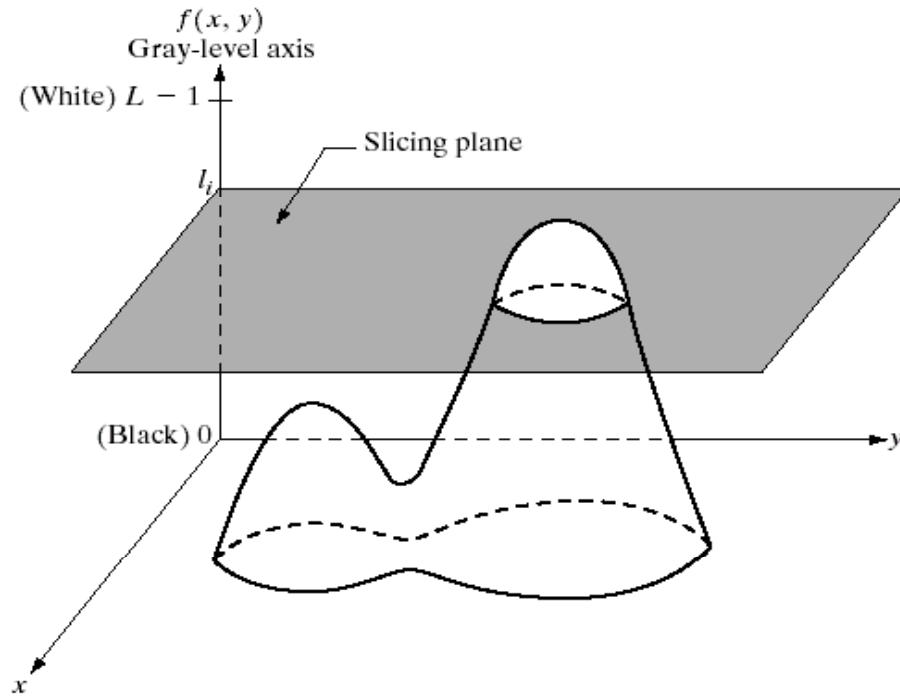
- To change color → Hue
- To change brightness → Intensity
- To change the purity of color → Saturation

# Pseudo color processing

# Pseudo Coloring

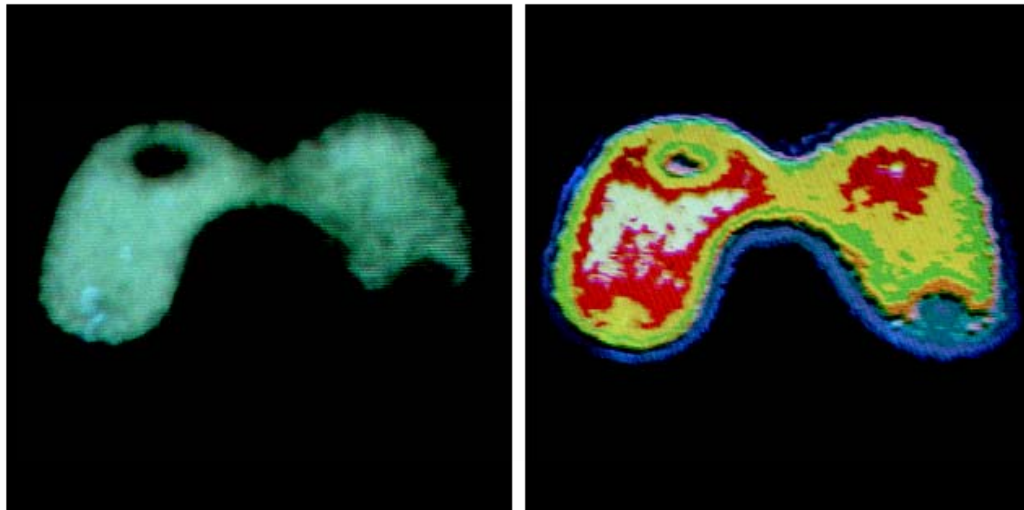
- Assign colors to monochrome images, based on various properties of their gray-level content.
- It is mainly used for human visualization and interpretation.
  - Intensity slicing
  - Intensity to color transformation

# Intensity Slicing



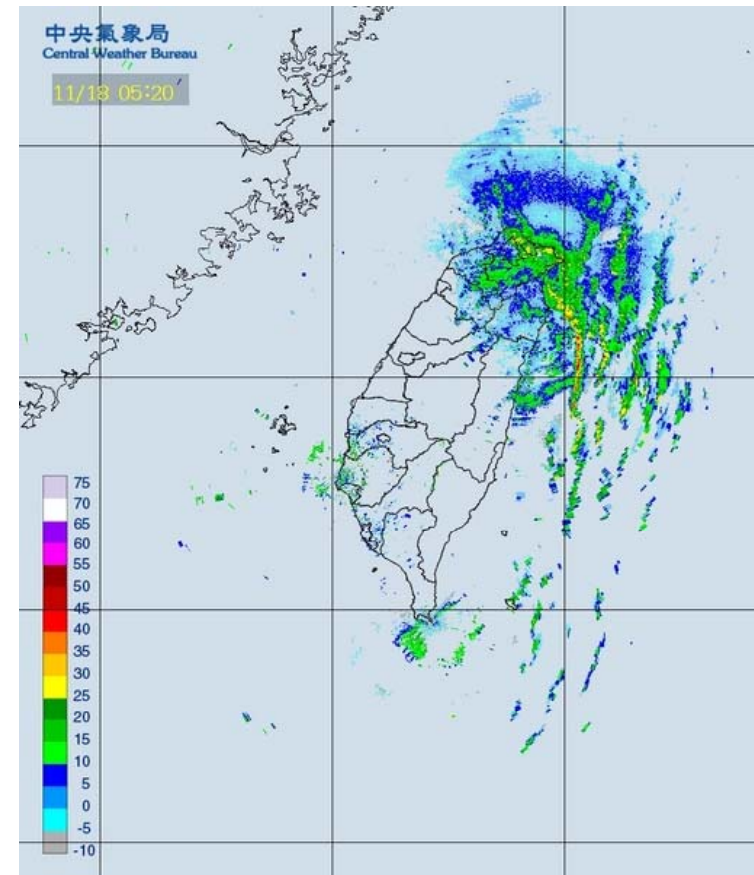
- Thresholding with colors
- Extending to more than one plane? - Sure!

# Intensity Slicing



a b

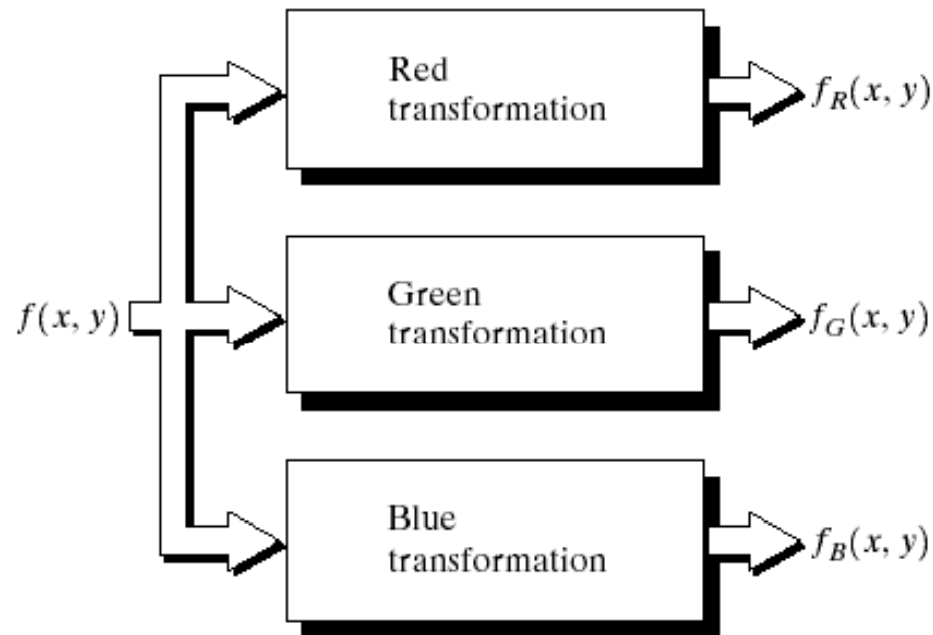
**FIGURE 6.20** (a) Monochrome image of the Picker Thyroid Phantom. (b) Result of density slicing into eight colors. (Courtesy of Dr. J. L. Blankenship, Instrumentation and Controls Division, Oak Ridge National Laboratory.)



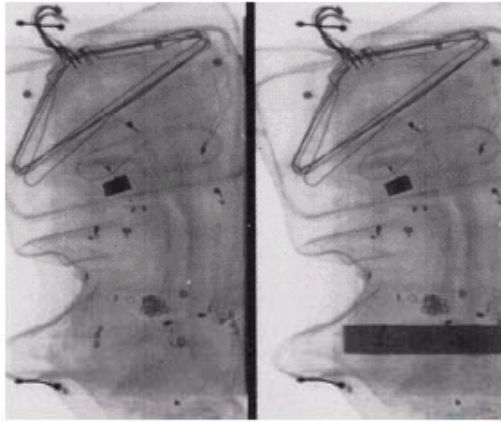
雷達回波圖

# Intensity to color transformations

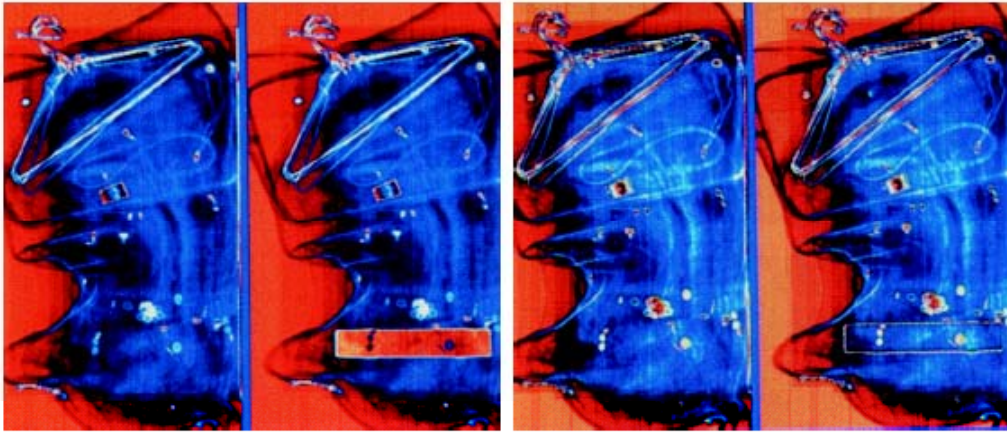
- Perform three independent transformations on the gray-level of an input monochrome image.
- The outputs of the three transformations are fed to the Red, Green, and Blue channels of a color monitor.



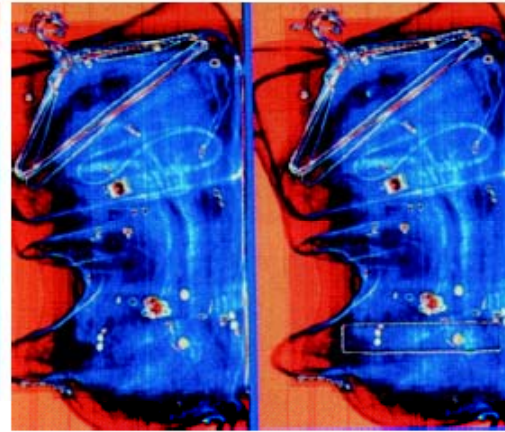
Normal  
luggage



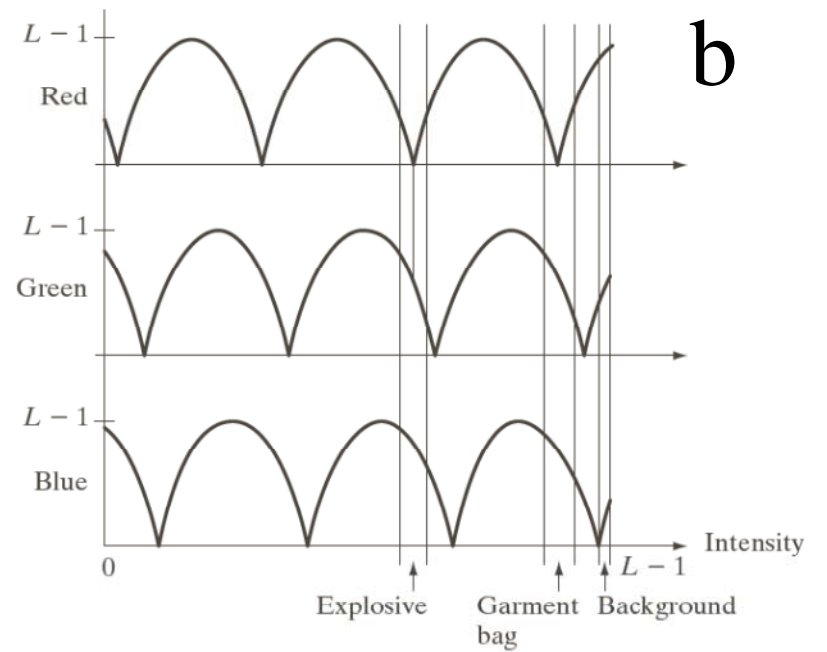
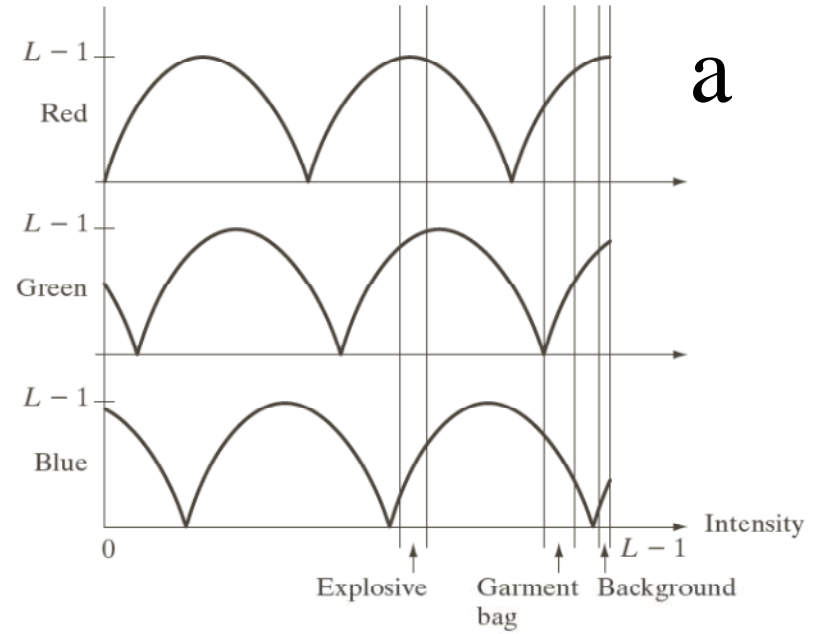
With  
explosives



Transformed by  
function **a**

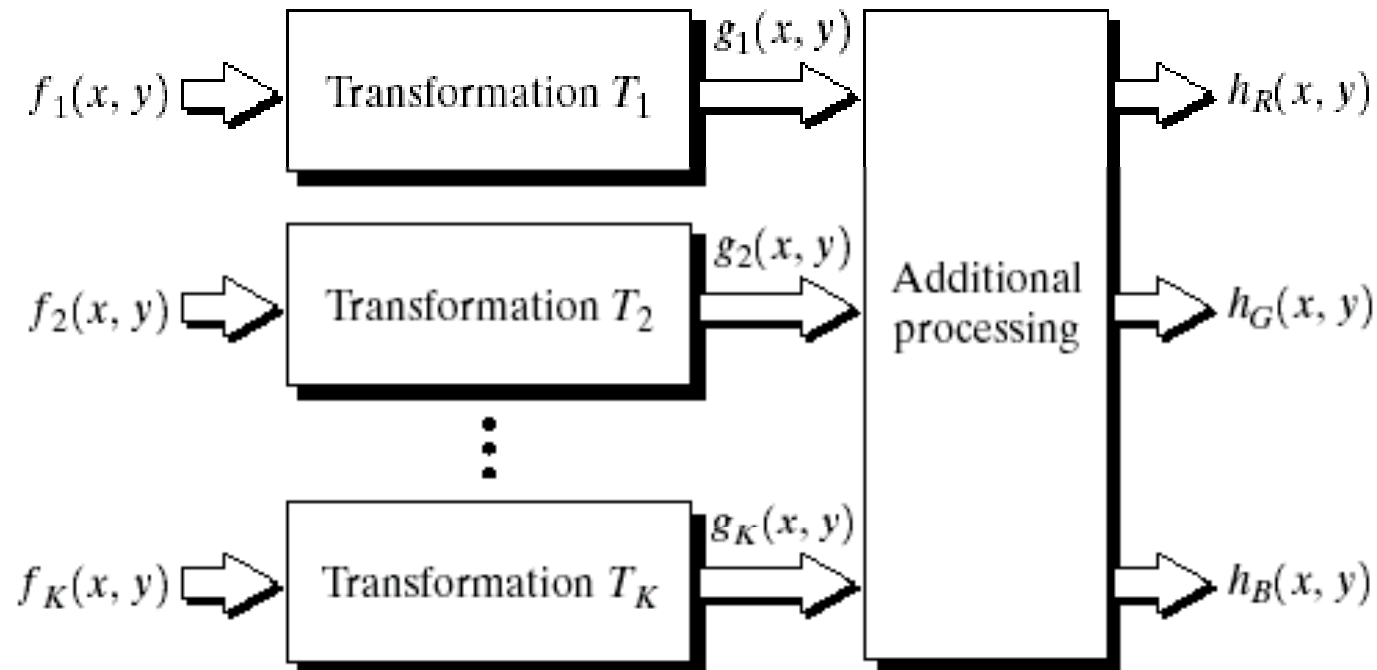


Transformed by  
function **b**



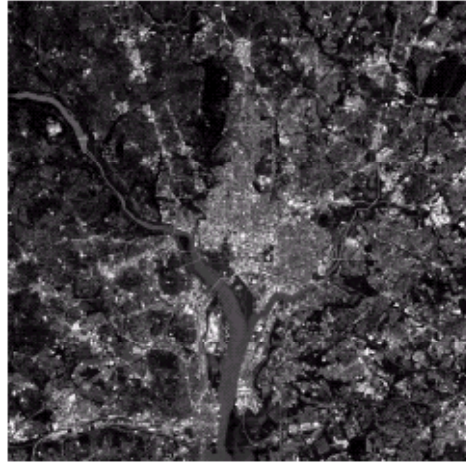
# Advanced color transformations

- Frequently used in multispectral imaging

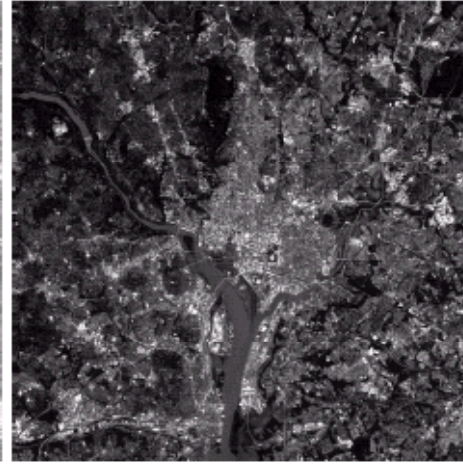




(a) Visible red



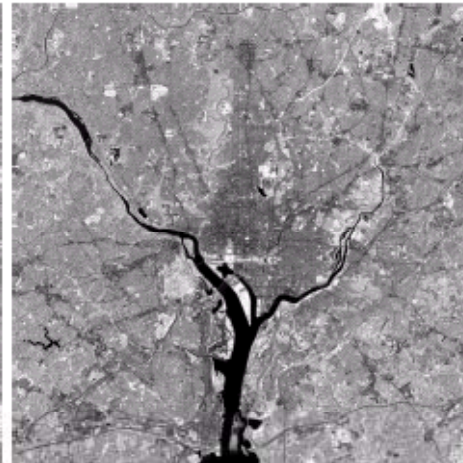
(b) Visible green



(c) Visible blue



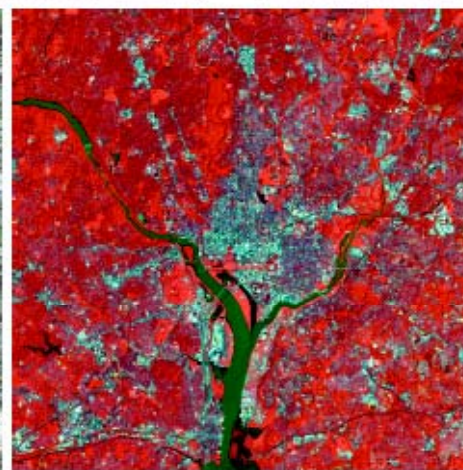
(d) Near infrared



Combining  
(a), (b), (c)



Combining  
(d), (b), (c)



Full color processing

# Color Transformations

- It is useful to think of a color image as a vector valued image, where each pixel has associated with it, as vector of three values.
- Each components of this vector corresponds to a different aspect of color, depending on the color model being used.
  - [ R, G, B ], [ H, S, I ]



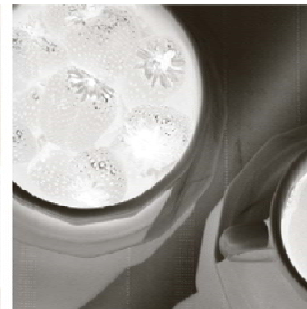
Full color



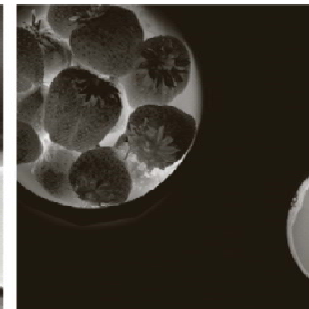
Cyan



Magenta



Yellow



Black



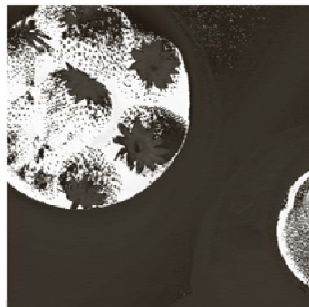
Red



Green



Blue



Hue



Saturation



Intensity

# Color Transformations

- Intensity transformation function (gray-scale)

$$s = T(r)$$

- Color transformation (color mapping function)

$$s_i = T_i(r_1, r_2, \dots, r_n) \quad i = 1, 2, \dots, n$$

$n$ : the number of color components

# Example: Modifying intensity

$$g(x, y) = k \cdot f(x, y)$$

HSI space

$$\begin{bmatrix} s_1 \\ s_2 \\ s_3 \end{bmatrix} = \begin{bmatrix} r_1 \\ r_2 \\ kr_3 \end{bmatrix}$$

RGB space

$$\begin{bmatrix} s_1 \\ s_2 \\ s_3 \end{bmatrix} = \begin{bmatrix} kr_1 \\ kr_2 \\ kr_3 \end{bmatrix}$$

CMY space

$$\begin{bmatrix} s_1 \\ s_2 \\ s_3 \end{bmatrix} = \begin{bmatrix} kr_1 \\ kr_2 \\ kr_3 \end{bmatrix} + (1 - k)$$

# Example: Modifying intensity

a b  
c d e

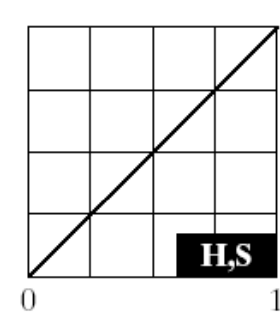
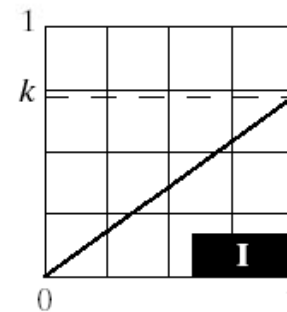
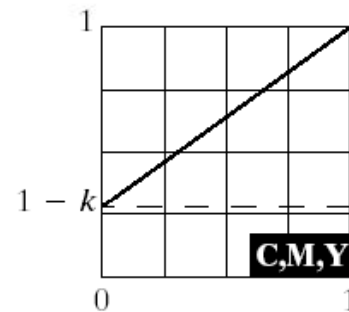
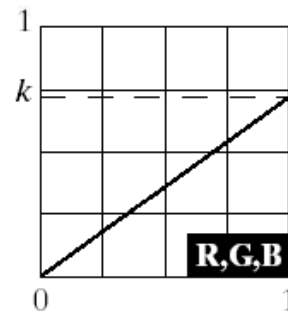
**FIGURE 6.31**

Adjusting the intensity of an image using color transformations.

(a) Original image. (b) Result of decreasing its intensity by 30% (i.e., letting  $k = 0.7$ ).

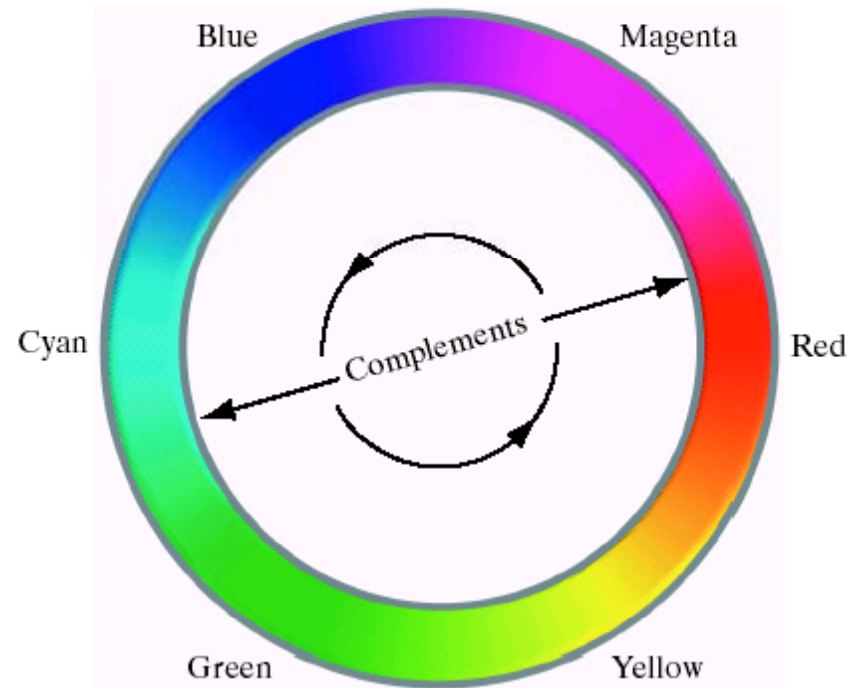
(c)–(e) The required RGB, CMY, and HSI transformation functions.

(Original image courtesy of MedData Interactive.)



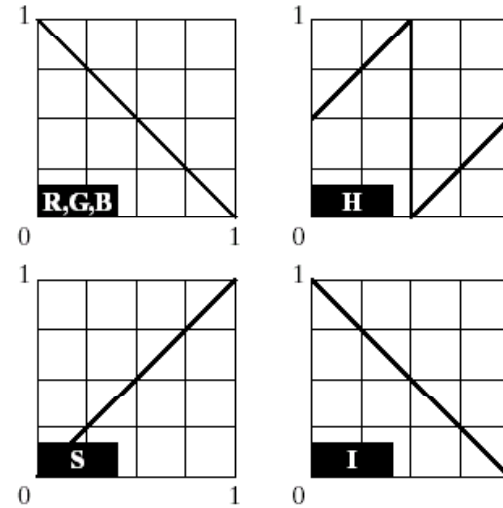
# Color complements

- Hues opposite one another in a color circle are called complements.
- Negative images
  - enhancing details embedded in dark regions



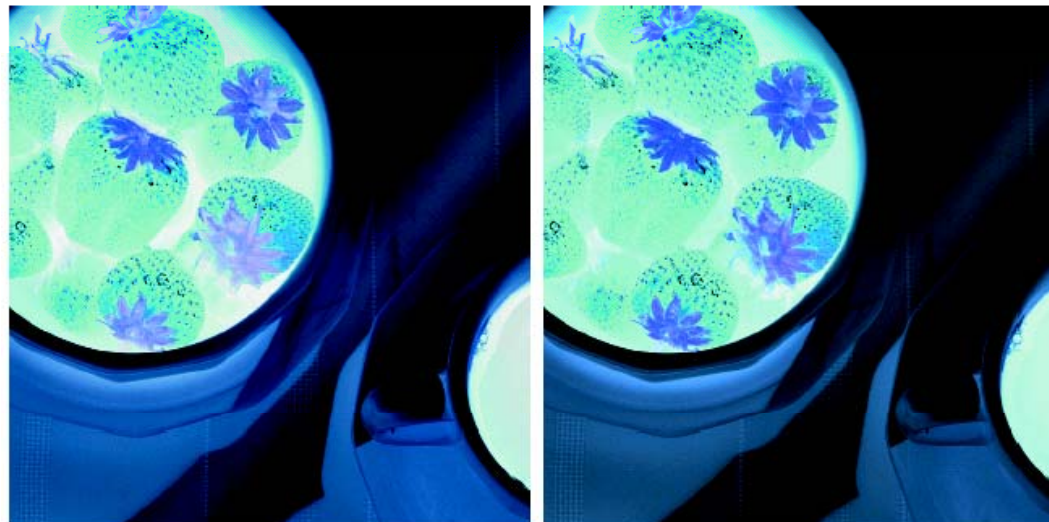


# Example: Color complement



a	b
c	d

**FIGURE 6.33**  
Color complement transformations. (a) Original image. (b) Complement transformation functions. (c) Complement of (a) based on the RGB mapping functions. (d) An approximation of the RGB complement using HSI transformations.



# Color Slicing

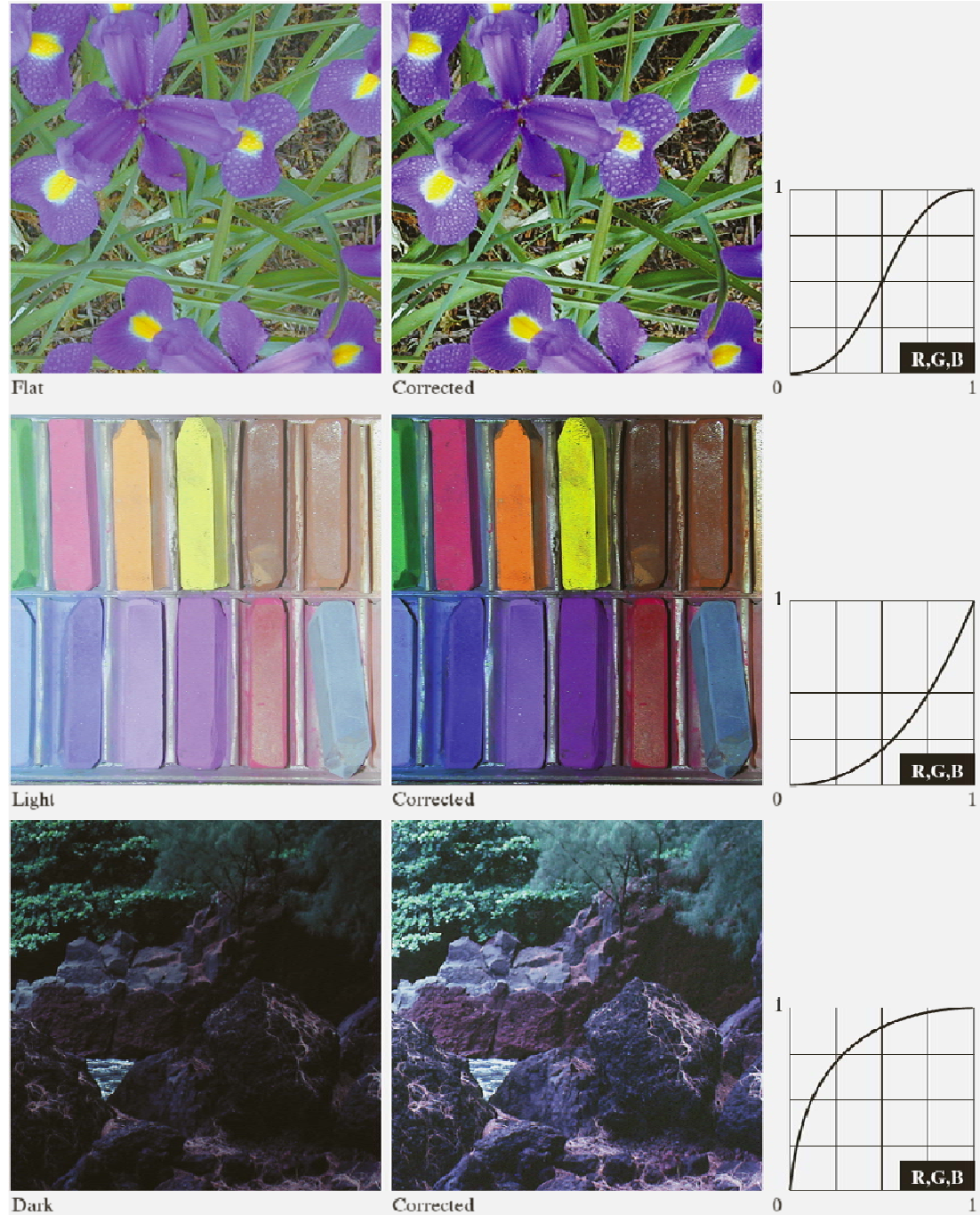
- Color slicing is similar to intensity slicing



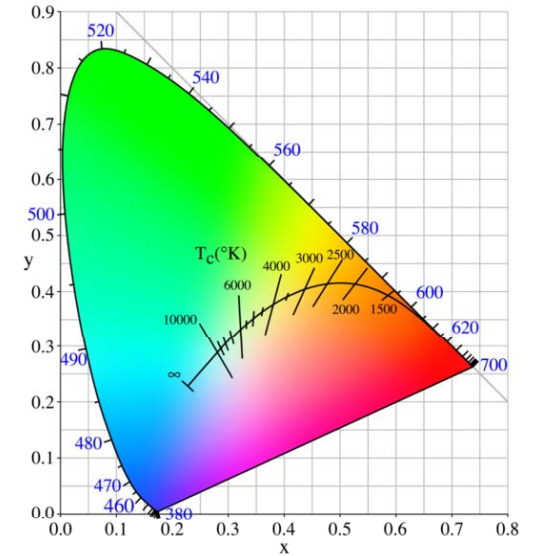
Detect reds centered at  $RGB = (0.6863, 0.1608, 0.1922)$ .  
(pixels else were replaced by color  $(0.5, 0.5, 0.5)$ .)

# Tone and color correction

What if red, green, and blue have different transformations?  
- **tonal/color adjustment**

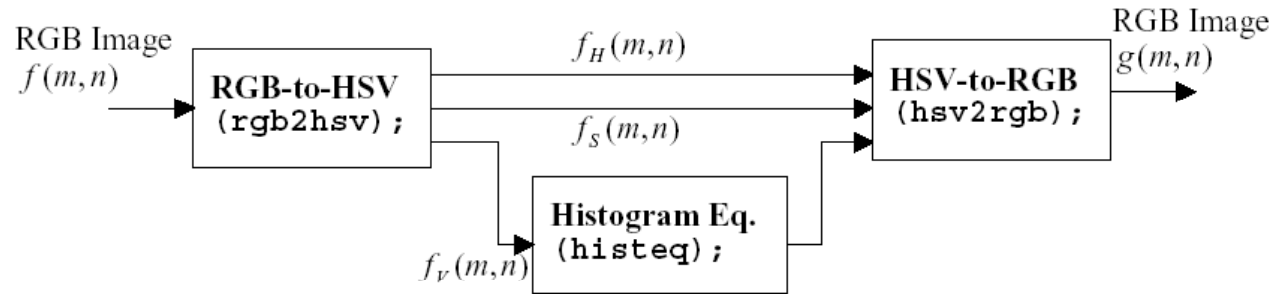


# Color balance

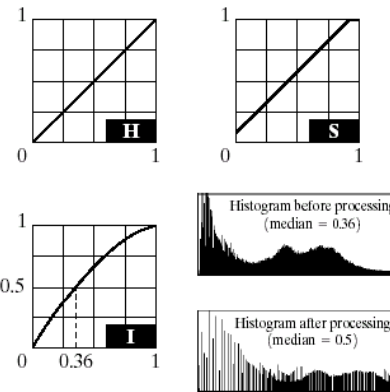


Color Temperature	Light Source
1000-2000 K	Candlelight
2500-3500 K	Tungsten Bulb (household variety)
3000-4000 K	Sunrise/Sunset (clear sky)
4000-5000 K	Fluorescent Lamps
5000-5500 K	Electronic Flash
5000-6500 K	Daylight with Clear Sky
6500-8000 K	Moderately Overcast Sky
9000-10000 K	Shade or Heavily Overcast Sky

# Color Histogram Equalization



Original



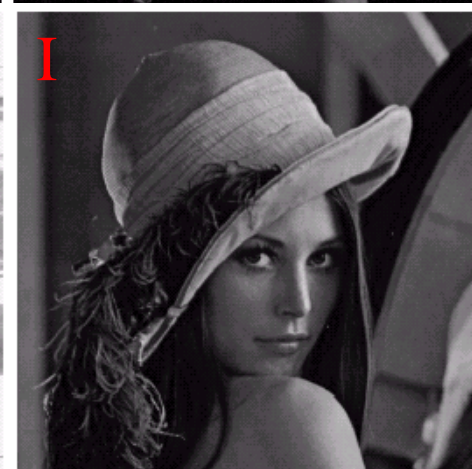
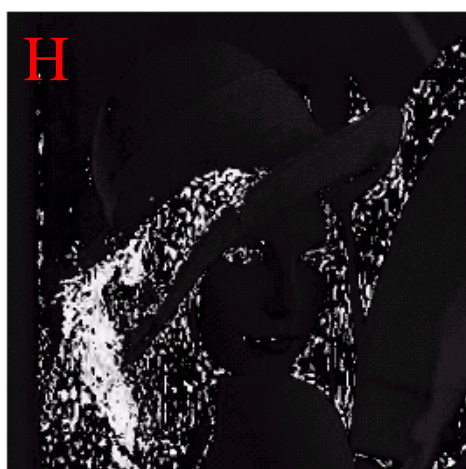
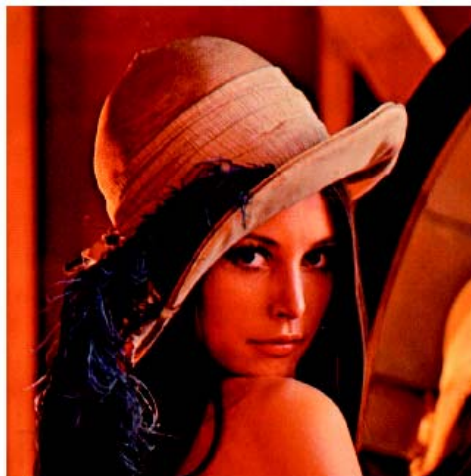
After equalization



Increase saturation slightly

# Color Image smoothing

- RGB: all components individually transformed by an appropriate smoothing mask
- HSI: only I component transformed
- Any difference in the results?
  - Colors not presenting in the original image might be introduced in the RGB method.

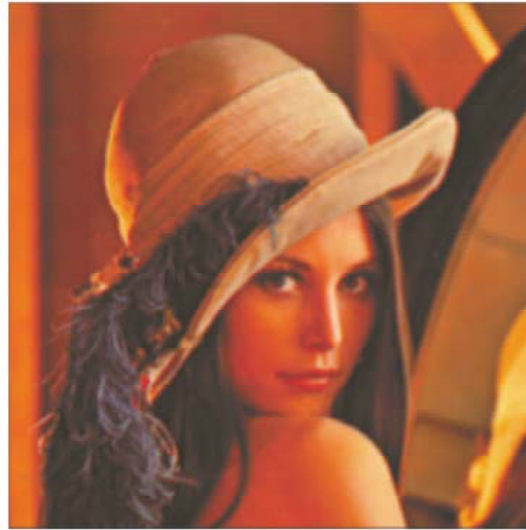


# Color Image smoothing

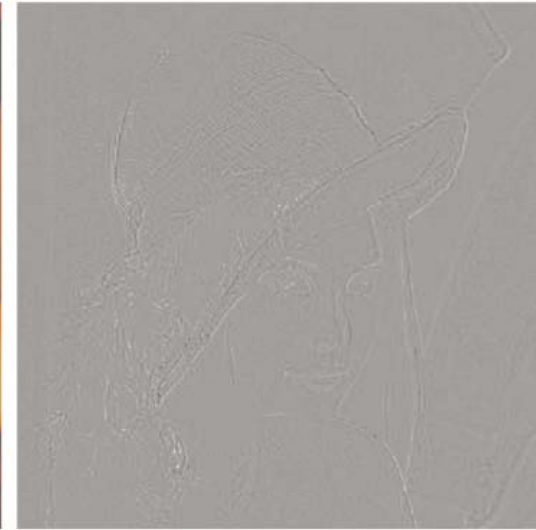
Image smoothed with a 5x5 averaging mask.



RGB



HSI



difference



# Color image sharpening

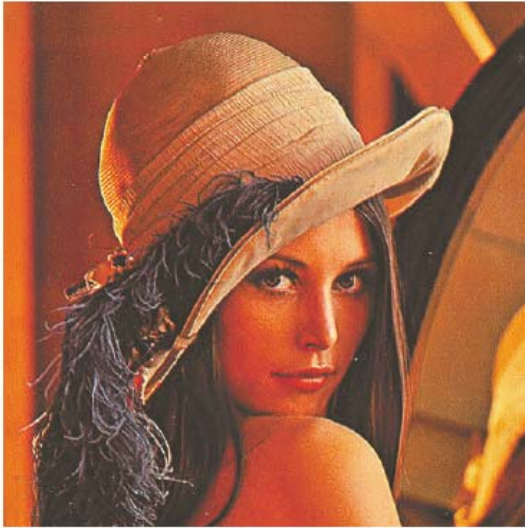
- Sharpening of color images can be performed in a manner analogous to smoothing, using appropriate masks, say the Laplacian mask

0	1	0
1	-4	1
0	1	0

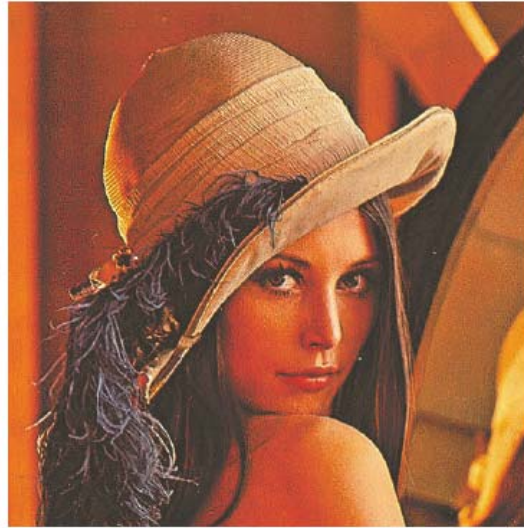
1	1	1
1	-8	1
1	1	1

# Color image sharpening

Image sharpened with a Laplacian mask.



RGB



HSI

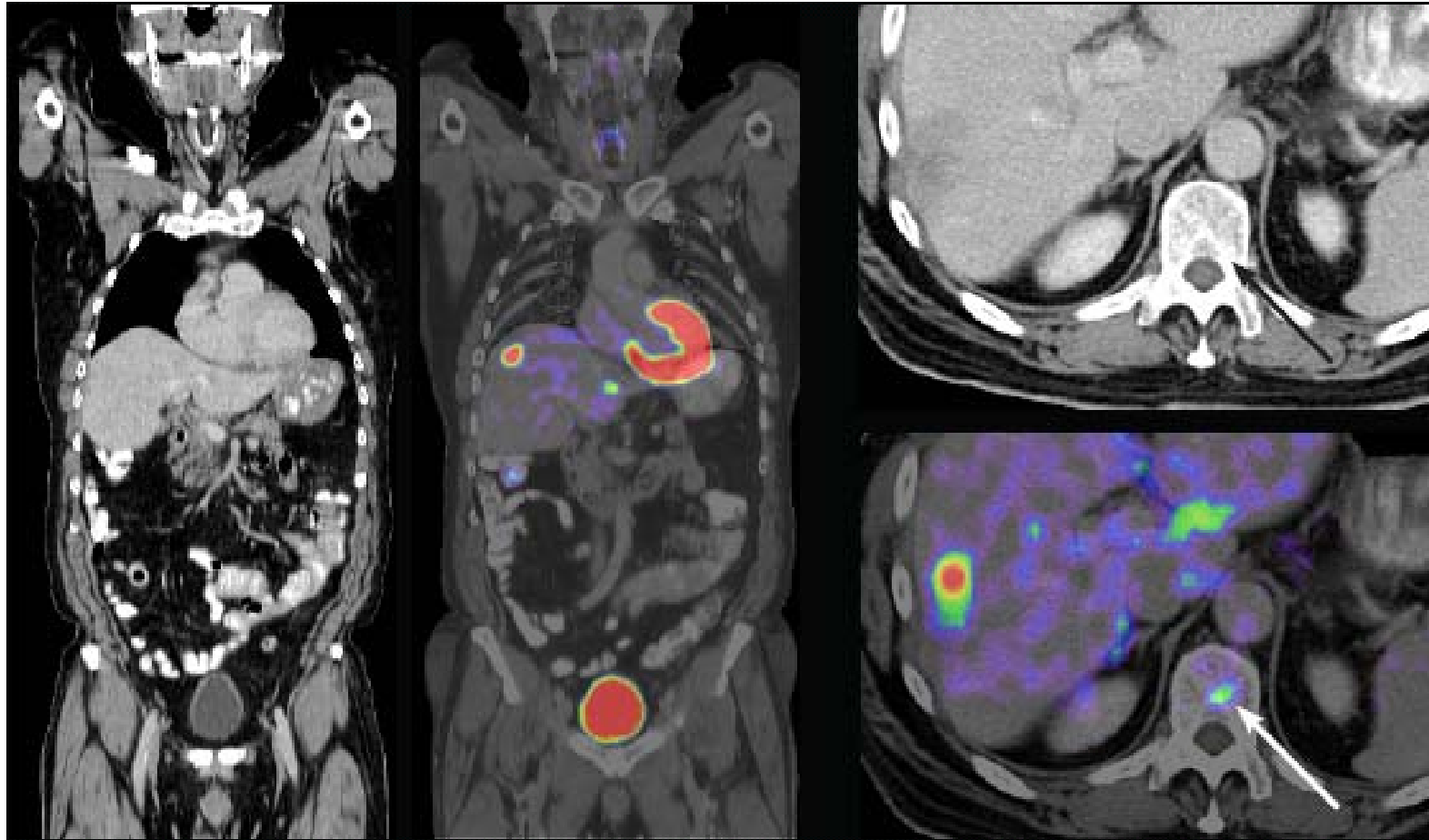


difference

# Possible medical applications

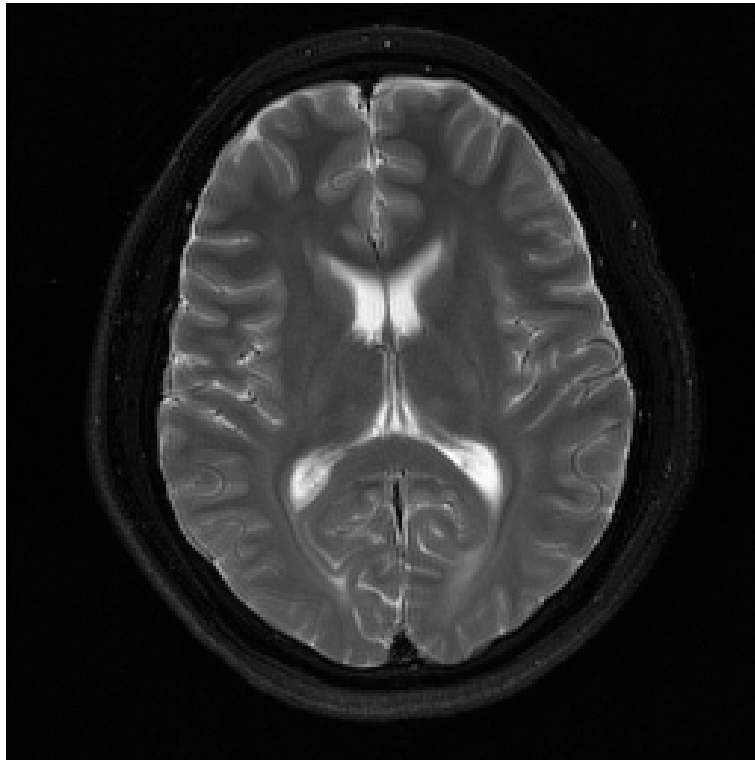
- In fact, not many...
- Image fusion between different imaging modalities
- Demonstration of neural/muscular fiber orientation

# Medical image fusion

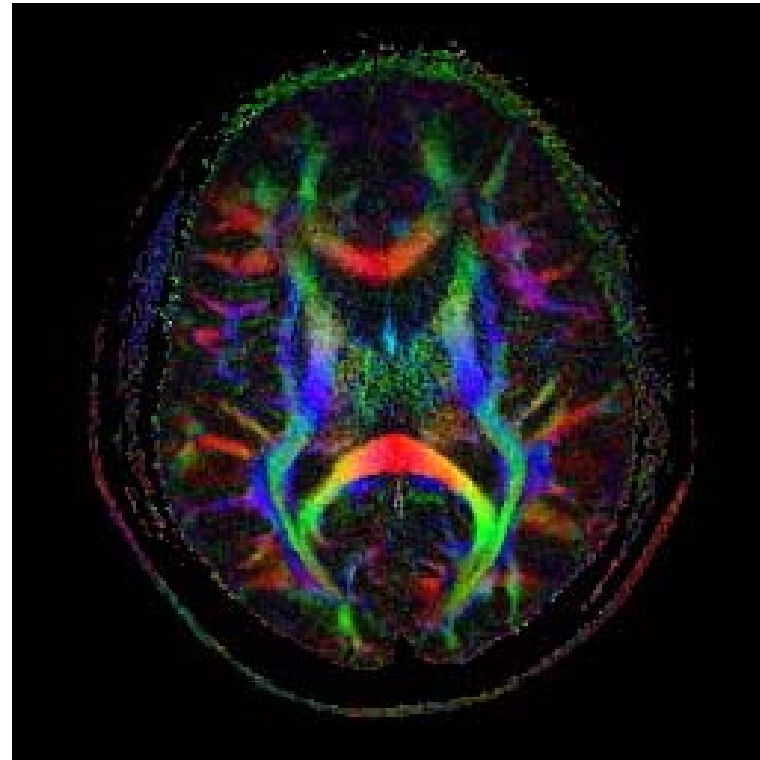


CT(gray-level) + PET (color) fusion

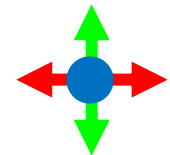
# Neural fiber by diffusion MRI



T2WI of human brain



colored FA map



# Review

- Fundamentals of colors
- Color models: RGB, CMYK, HSI
- Pseudo color processing
- Full color processing
  - 基本上灰階能做的事，彩色影像通通能做！
- Medical applications

生醫影像研究方法：影像色彩學