

# COLOR IMAGE PROCESSING

## Digital Image Processing

### Light

*Light* is fundamental for *color vision*

Unless there is a source of light, there is nothing to see!

What do we see?

We do not see objects, but the light that has been *reflected by* or *transmitted through* the objects

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### Preview



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### Light and EM waves

Light is an electromagnetic wave

If its wavelength is comprised between **400 and 700 nm** (*visible spectrum*), the wave can be detected by the human eye and is called *monochromatic light*

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### Preview



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## Physical properties of light

This distribution may indicate:

- 1) a dominant wavelength (or frequency) which is the color of the light (*hue*),
- 2) brightness (luminance), intensity of the light (*value*),
- 3) purity (*saturation*), which describes the degree of vividness.

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### Spectrum of White Light

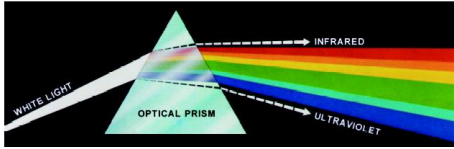
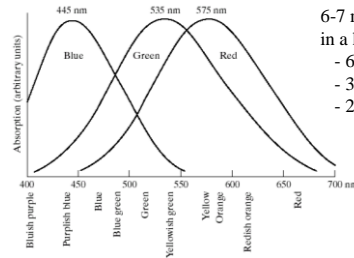


FIGURE 6.1 Color spectrum seen by passing white light through a prism. (Courtesy of the General Electric Co., Lamp Business Division.)

1666 Sir Isaac Newton, 24 year old, discovered white light spectrum.

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(Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2<sup>nd</sup> Edition.)

### Sensitivity of Cones in the Human Eye



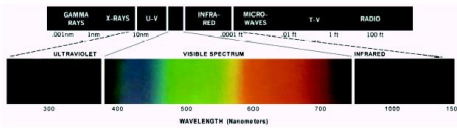
6-7 millions cones in a human eye  
 - 65% sensitive to Red light  
 - 33% sensitive to Green light  
 - 2% sensitive to Blue light

Primary colors:  
 Defined CIE in 1931  
 Red = 700 nm  
 Green = 546.1 nm  
 Blue = 435.8 nm

CIE = Commission Internationale de l'Eclairage  
 (The International Commission on Illumination)

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(Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2<sup>nd</sup> Edition.)

### Electromagnetic Spectrum

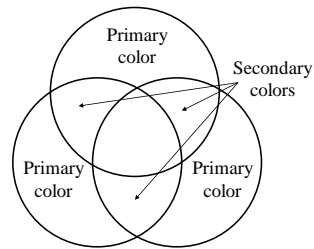


Visible light wavelength: from around 400 to 700 nm

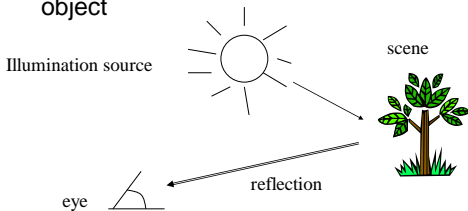
- For an achromatic (monochrome) light source, there is only 1 attribute to describe the quality: **intensity**
- For a chromatic light source, there are 3 attributes to describe the quality:  
**Radiance** = total amount of energy flow from a light source (Watts)  
**Luminance** = amount of energy received by an observer (lumens)  
**Brightness** = intensity

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(Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2<sup>nd</sup> Edition.)

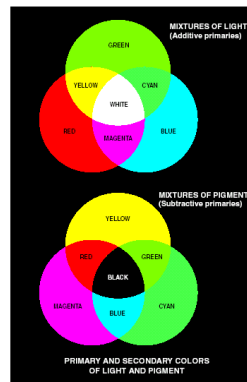
### Primary and Secondary Colors



- The color that human perceive in an object = the light **reflected** from the object



### Primary and Secondary Colors (cont.)



Additive primary colors: RGB  
 use in the case of light sources such as color monitors

RGB add together to get white

Subtractive primary colors: CMY  
 use in the case of pigments in printing devices

White subtracted by CMY to get Black

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(Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2<sup>nd</sup> Edition.)

### Light and Color

The frequency ( or mix of frequencies ) of the light determines the color.

The amount of light(sheer quantity of photons ) is the intensity.

Three independent quantities are used to describe any particular color. : hue, saturation, and lightness or brightness or intensity.

The *hue* is determined by the dominant wavelength.(the apparent color of the light)



When we call an object "red," we are referring to its hue. Hue is determined by the dominant wavelength.

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### Color Characterization

- Hue: dominant color corresponding to a dominant wavelength of mixture light wave
- Saturation: Relative purity or amount of white light mixed with a hue (inversely proportional to amount of white light added)
- Brightness: Intensity

Hue } Chromaticity  
Saturation }

amount of red (X), green (Y) and blue (Z) to form any particular color is called *tristimulus*.

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### Light and Color

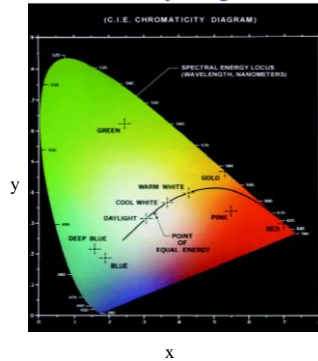


The saturation of a color ranges from neutral to brilliant. The circle on the right is a more vivid red than the circle on the left although both have the same hue.

The *saturation* is determined by the excitation purity, and depends on the amount of white light mixed with the hue. A pure hue is fully saturated, i.e. no white light mixed in. Hue and saturation together determine the *chromaticity* for a given color.

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### CIE Chromaticity Diagram



Trichromatic coefficients:

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

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

$$z = \frac{Z}{X + Y + Z}$$

$$x + y + z = 1$$

Points on the boundary are fully saturated colors

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(Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2nd Edition.

### Light and Color

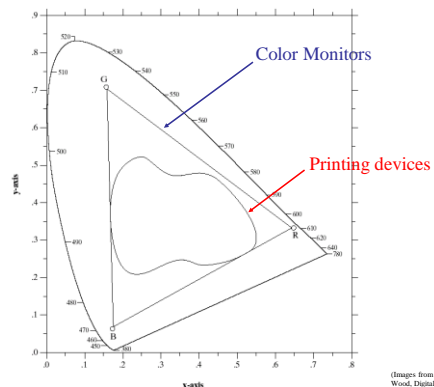


Lightness or brightness refers to the amount of light the color reflects or transmits.

Finally, the *intensity* is determined by the actual amount of light, with more light corresponding to more intense colors ( the total light across all frequencies).

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### Color Gamut of Color Monitors and Printing Devices



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(Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2nd Edition.

**Color Fundamentals (con't)**

- **Tri-stimulus** values: The amount of Red, Green and Blue needed to form any particular color  
Denoted by: X, Y and Z

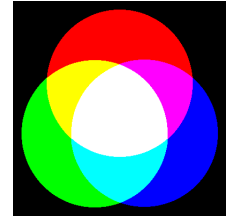
- **Tri-chromatic coefficient:**

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

$$x + y + z = 1$$

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**RGB Color model**



Active displays, such as computer monitors and television sets, emit combinations of red, green and blue light. This is an **additive** color model

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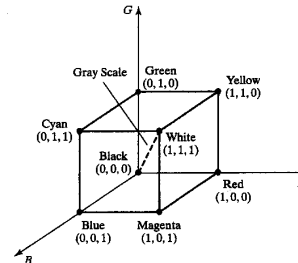
**Color Models**

- The purpose of a color model (also called color space or color system) is to facilitate the specification of colors in some standard, generally accept way.
- **RGB** (red, green, blue) : monitor, video camera.
- **CMY** (cyan, magenta, yellow), **CMYK** (CMY, black) model for color printing.
- and **HSI** model, which corresponds closely with the way humans describe and interpret color.

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**The RGB Color Spaces**

Purpose of color models: to facilitate the specification of colors in some standard



RGB color models:  
- based on Cartesian coordinate system

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(Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2nd Edition.

**RGB (red, green, blue)**

The RGB colour space is related to human vision through the tristimulus theory of colour vision.

The RGB is an additive colour model. The primary colours red, green and blue are combined to reproduce other colours.

In the RGB colour space, a colour is represented by a triplet (r,g,b)

- r gives the intensity of the red component
- g gives the intensity of the green component
- b gives the intensity of the blue component

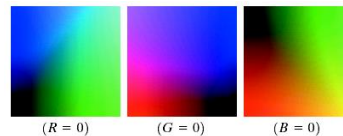
Here we assume that r,g,b are real numbers in the interval [0,1]. You will often see the values of r,g,b as integers in the interval [0,255].

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**RGB Color Cube**



R = 8 bits  
G = 8 bits  
B = 8 bits } Color depth 24 bits = 16777216 colors

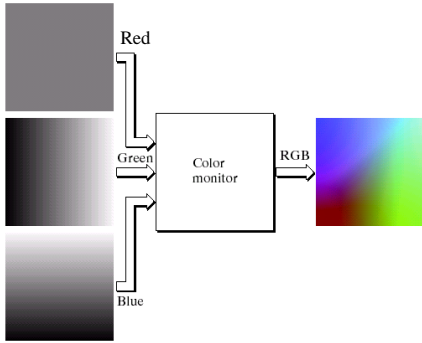


Hidden faces of the cube

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(Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2nd Edition.

### RGB Color Model

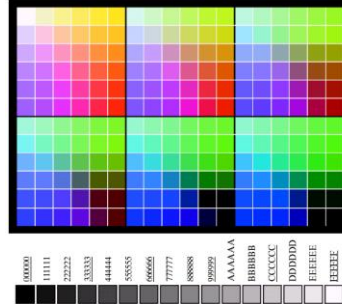


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Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2<sup>nd</sup> Edition.

### Safe RGB Colors

Safe RGB colors: a subset of RGB colors.

There are 216 colors common in most operating systems.



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**FIGURE 6.10**  
(a) The 216 safe RGB colors.  
(b) All the grays in the 256-color RGB system (grays that are part of the safe color group are shown underlined).

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Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2<sup>nd</sup> Edition.

### RGB Color Model (cont.)

- Most modern computer monitors can transmit "true color," or 24-bit color. This means each "channel" (R, G, or B) contains 8 bits per channel that can transmit color.
- Eight bits means the channel can make eight combinations of on or off of the color, per pixel, 256 colors total. You have three channels. How many colors can be generated?
- $256 \times 256 \times 256 = 16,777,216$  possible colors.

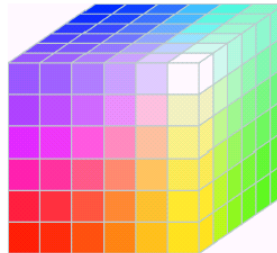
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### RGB Safe-color Cube

Number System	Color Equivalents					
Hex	00	33	66	99	CC	FF
Decimal	0	51	102	153	204	255

**TABLE 6.1**

Valid values of each RGB component in a safe color.

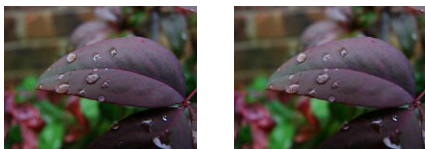


The RGB Cube is divided into 6 intervals on each axis to achieve the total  $6^3 = 216$  common colors.  
However, for 8 bit color representation, there are the total 256 colors. Therefore, the remaining 40 colors are left to OS.

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Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2<sup>nd</sup> Edition.

### RGB Color Model (cont.)

- Eight-bit color also exists, 256 colors total.
- These are called "web-safe" colors, because they are sure to render accurately on anyone's monitor.
- Nowadays we don't have to worry about that as much.
  - (Below: 8-bit vs. 24-bit color.)



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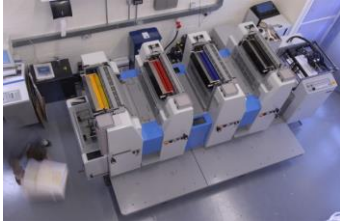
### CMY Color model

- Additive color won't work for printing because we can't begin with black.
- We must begin with a piece of paper, and that's usually white.
- White, as we know, is all colors. So we can't add to all colors. We must subtract.
- Furthermore, an offset printing press can't generate the enormous number of colors available on a computer screen.
- We need to run a piece of paper through the press for each ink.

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## CMY Color model

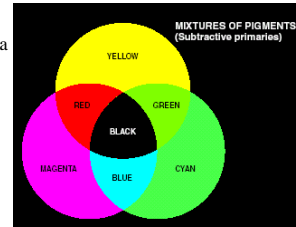
- The press below has four heads, one for each ink in the CMYK system.



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## CMY Color model

C = Cyan  
M = Magenta  
Y = Yellow  
K = Black



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

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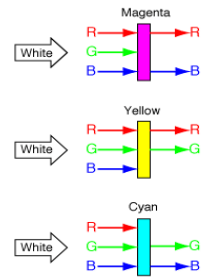
## CMY Color model

- Printed color, therefore, is based on the subtractive system.
- While the additive primaries (used to generate all colors) are RGB, beginning with black...
- ...the subtractive primaries are Cyan, Magenta, Yellow and Black (CMYK), and begin with white.
- Cyan=blue-green. Magenta=red-blue. Yellow=red-green.
- Note the relationship between the additive and subtractive primaries.

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## CMY Color model

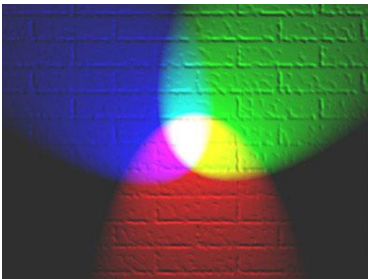
- Why?
  - Pigments absorb light
- Thinking:
  - the Color Filters
- Question:
  - Yellow + Cyan=?



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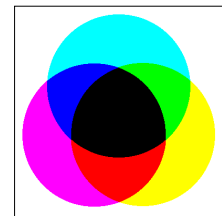
## CMY Color model

- You can actually project the additive colors to produce the subtractive.



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## CMY Color model



Passive displays, such as color inkjet printers, **absorb** light instead of emitting it. Combinations of **cyan, magenta and yellow** inks are used. This is a **subtractive** color model.

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## CMY

CMY cartridges for colour printers.



The conversion from RGB to CMY is given by the formula

$$\begin{bmatrix} c \\ m \\ y \end{bmatrix} = \begin{bmatrix} 1 \\ 1 \\ 1 \end{bmatrix} - \begin{bmatrix} r \\ g \\ b \end{bmatrix}$$

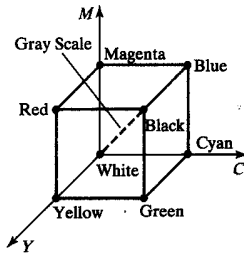
**Example 11.2:** The red colour is written in RGB as (1,0,0). In CMY it is written as

$$\begin{bmatrix} c \\ m \\ y \end{bmatrix} = \begin{bmatrix} 1 \\ 1 \\ 1 \end{bmatrix} - \begin{bmatrix} r \\ g \\ b \end{bmatrix} = \begin{bmatrix} 1 \\ 1 \\ 0 \end{bmatrix} = \begin{bmatrix} 0 \\ 1 \\ 1 \end{bmatrix}$$

that is, magenta and yellow.

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### The CMY and CMYK Color Spaces



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**Example 11.3:** The magenta is written in CMY as (0,1,0). In RGB it is written as

$$\begin{bmatrix} 0 \\ 1 \\ 0 \end{bmatrix} = \begin{bmatrix} 1 \\ 1 \\ 1 \end{bmatrix} - \begin{bmatrix} r \\ g \\ b \end{bmatrix}$$

giving,

$$\begin{bmatrix} r \\ g \\ b \end{bmatrix} = \begin{bmatrix} 1 \\ 1 \\ 1 \end{bmatrix} - \begin{bmatrix} 0 \\ 1 \\ 0 \end{bmatrix} = \begin{bmatrix} 1 \\ 0 \\ 1 \end{bmatrix}$$

that is, red and blue.

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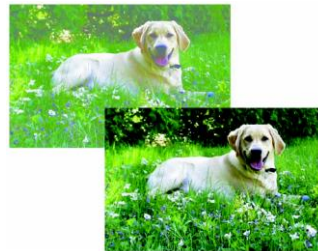
### The CMY and CMYK Color Models

- Cyan, Magenta and Yellow are the secondary colors of light
- Most devices that deposit colored pigments on paper, such as color printers and copiers, require CMY data input.

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

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### CMYK Color model



The image on the left was printed with only CMY inks  
Black inks add contrast and depth to image on the image on the right

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## CMYK Color model

- Subtractive primaries are based on ink colors of CMYK.
- Black is abbreviated "K" by tradition, perhaps because it is the "key" color.
- In color printing, you need black to make the other colors vibrant and snappy.
- This is why the subtractive process is also called the four-color process, producing color separations, or "seps."
- Colors used are called the process colors.

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## HSI Color Model

RGB, CMY models are not good for human interpretation

HSI Color model:

Hue: Dominant color

Saturation: Relative purity (inversely proportional to amount of white light added)

Intensity: Brightness

} Color carrying information

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(Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2nd Edition.)

## CMYK Color model

For printing and graphics art industry, CMY is not enough; a fourth primary, K which stands for black, is added.

Conversions between RGB and CMYK are possible, although they require some extra processing.

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## HSI Color Model



Source: <http://www.cs.cornell.edu/connor/cv11199sp/>

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## HSI color model

- Will you describe a color using its R, G, B components?
- Human describe a color by its hue, saturation, and brightness
  - Hue : color attribute
  - Saturation : purity of color (white->0, primary color->1)
  - Brightness : achromatic notion of intensity

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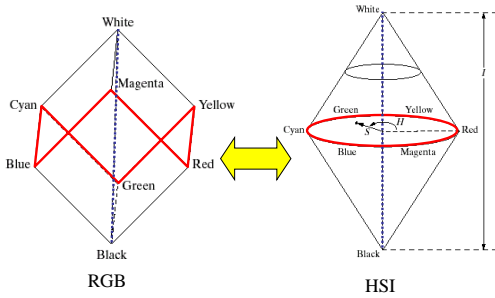
## HSI Color Model

- **Hue** is defined as an angle
  - 0 degrees is **RED**
  - 120 degrees is **GREEN**
  - 240 degrees is **BLUE**
- **Saturation** is defined as the percentage of distance from the center of the HSI triangle to the pyramid surface.
  - Values range from 0 to 1.
- **Intensity** is denoted as the distance "up" the axis from black.
  - Values range from 0 to 1

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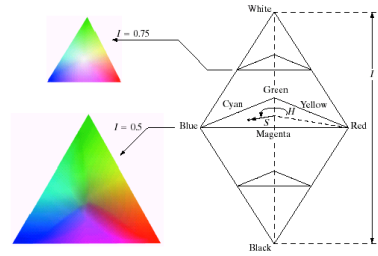


**Relationship Between RGB and HSI Color Models**



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(Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2<sup>nd</sup> Edition.)

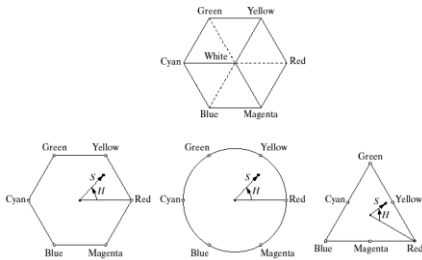
**HSI Color Model**



Intensity is given by a position on the vertical axis.

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**Hue and Saturation on Color Planes**



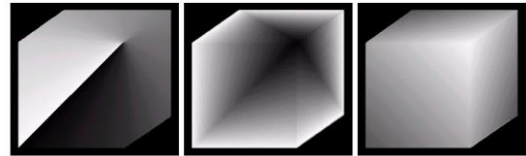
1. A dot in the plane is an arbitrary color
2. Hue is an angle from a red axis.
3. Saturation is a distance to the point.

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**Example: HSI Components of RGB Cube**



RGB Cube



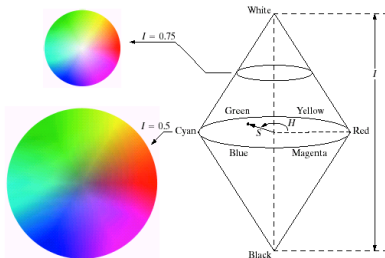
Hue

Saturation

Intensity

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(Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2<sup>nd</sup> Edition.)

**HSI Color Model (cont.)**



Intensity is given by a position on the vertical axis.

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**Converting Colors from RGB to HSI**

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

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

$$S = 1 - \frac{3}{R+G+B}$$

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

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### Converting Colors from HSI to RGB

RG sector:  $0 \leq H < 120$

$$R = I \left[ 1 + \frac{S \cos H}{\cos(60^\circ - H)} \right]$$

$$B = I(1 - S)$$

$$G = 1 - (R + B)$$

BR sector:  $240 \leq H \leq 360$

$$H = H - 240$$

$$B = I \left[ 1 + \frac{S \cos H}{\cos(60^\circ - H)} \right]$$

$$G = I(1 - S)$$

$$R = 1 - (G + B)$$

GB sector:  $120 \leq H < 240$

$$H = H - 120$$

$$R = I(1 - S)$$

$$G = I \left[ 1 + \frac{S \cos H}{\cos(60^\circ - H)} \right]$$

$$B = 1 - (R + G)$$

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### Color Image Processing

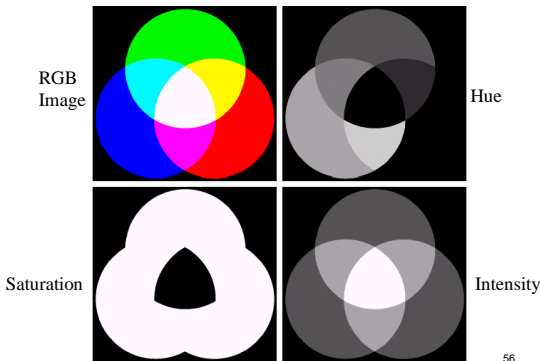
There are 2 types of color image processes

1. Pseudocolor image process: Assigning colors to gray values based on a specific criterion. Gray scale images to be processed may be a single image or multiple images such as multispectral images

2. Full color image process: The process to manipulate real color images such as color photographs.

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### Example: HSI Components of RGB Colors



(Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2<sup>nd</sup> Edition.

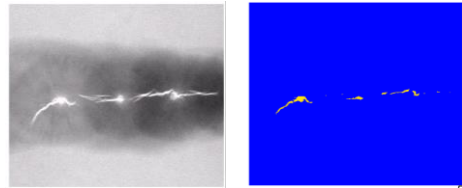
(Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2<sup>nd</sup> Edition.

### Pseudocolor Image Processing

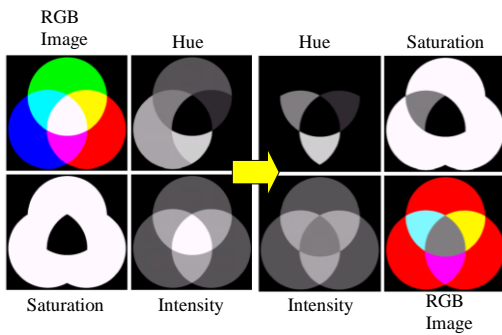
Pseudo color = false color : In some case there is no "color" concept for a gray scale image but we can assign "false" colors to an image.

Why we need to assign colors to gray scale image?

Answer: Human can distinguish different colors better than different shades of gray.



### Example: Manipulating HSI Components

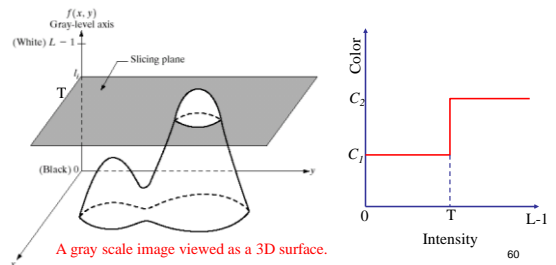


(Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2<sup>nd</sup> Edition.

### Intensity Slicing or Density Slicing

Formula:

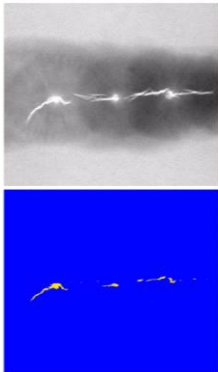
$$g(x, y) = \begin{cases} C_1 & \text{if } f(x, y) \leq T \\ C_2 & \text{if } f(x, y) > T \end{cases} \quad \begin{matrix} C_1 = \text{Color No. 1} \\ C_2 = \text{Color No. 2} \end{matrix}$$



A gray scale image viewed as a 3D surface.

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**Intensity Slicing Example**



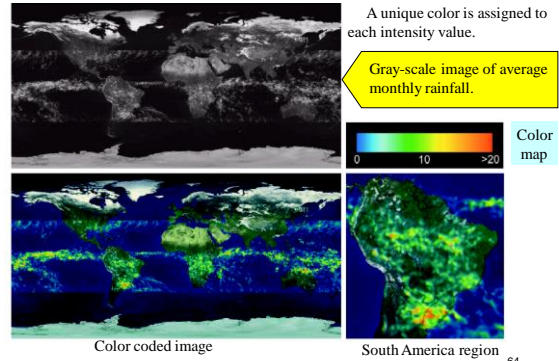
An X-ray image of a weld with cracks

After assigning a yellow color to pixels with value 255 and a blue color to all other pixels.

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(Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2<sup>nd</sup> Edition.)

**Multilevel Intensity Slicing Example....**



A unique color is assigned to each intensity value.

Gray-scale image of average monthly rainfall.

Color coded image

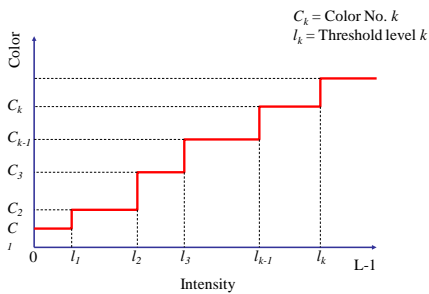
South America region

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(Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2<sup>nd</sup> Edition.)

**Multi Level Intensity Slicing**

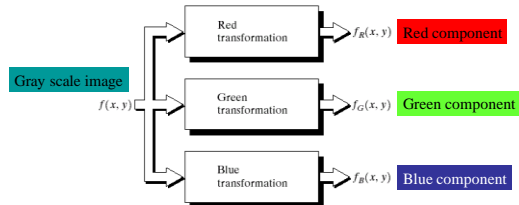
$$g(x, y) = C_k \quad \text{for } l_{k-1} < f(x, y) \leq l_k$$



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**Gray Level to Color Transformation**

Assigning colors to gray levels based on specific mapping functions

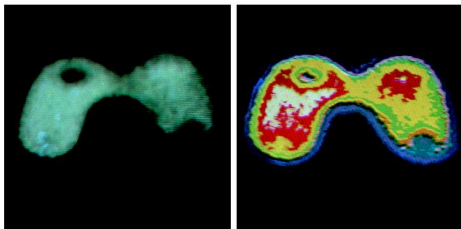


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(Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2<sup>nd</sup> Edition.)

**Multi Level Intensity Slicing Example**

$$g(x, y) = C_k \quad \text{for } l_{k-1} < f(x, y) \leq l_k \quad \begin{matrix} C_k = \text{Color No. } k \\ l_k = \text{Threshold level } k \end{matrix}$$



An X-ray image of the Picker Thyroid Phantom.

After density slicing into 8 colors

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(Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2<sup>nd</sup> Edition.)

**Gray Level to Color Transformation Example**

An X-ray image of a garment bag

An X-ray image of a garment bag with a simulated explosive device

Color coded images

Transformations

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### Gray Level to Color Transformation Example

An X-ray image of a garment bag

An X-ray image of a garment bag with a simulated explosive device

Transformations

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Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2nd Edition.

### Pseudocolor Coding Example

Visible blue  $\lambda = 0.45-0.52 \mu\text{m}$   
Max water penetration

Visible green  $\lambda = 0.52-0.60 \mu\text{m}$   
Measuring plant

Color composite images

Visible red  $\lambda = 0.63-0.69 \mu\text{m}$   
Plant discrimination

Near infrared  $\lambda = 0.76-0.90 \mu\text{m}$   
Biomass and shoreline mapping

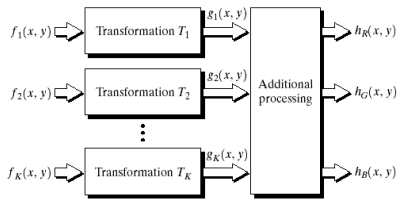
Washington D.C. area

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Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2nd Edition.

### Pseudocolor Coding

Used in the case where there are many monochrome images such as multispectral satellite images.



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Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2nd Edition.

### Pseudocolor Coding Example

← Pseudocolor rendition of Jupiter moon Io

Yellow areas = older sulfur deposits.  
Red areas = material ejected from active volcanoes.

← A close-up

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Images from Rafael C. Gonzalez and Richard E. Wood, Digital Image Processing, 2nd Edition.

## Color theory

Some general guidelines for choosing color:

- Differences will be emphasized. For example, yellow surrounded by green will tend to appear more yellow; green surrounded by yellow will tend to appear more green. This is the rule of simultaneous contrast.



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