

# Digital Image Processing (CSE/ECE 478)

## Lecture 13 : Color Image Processing

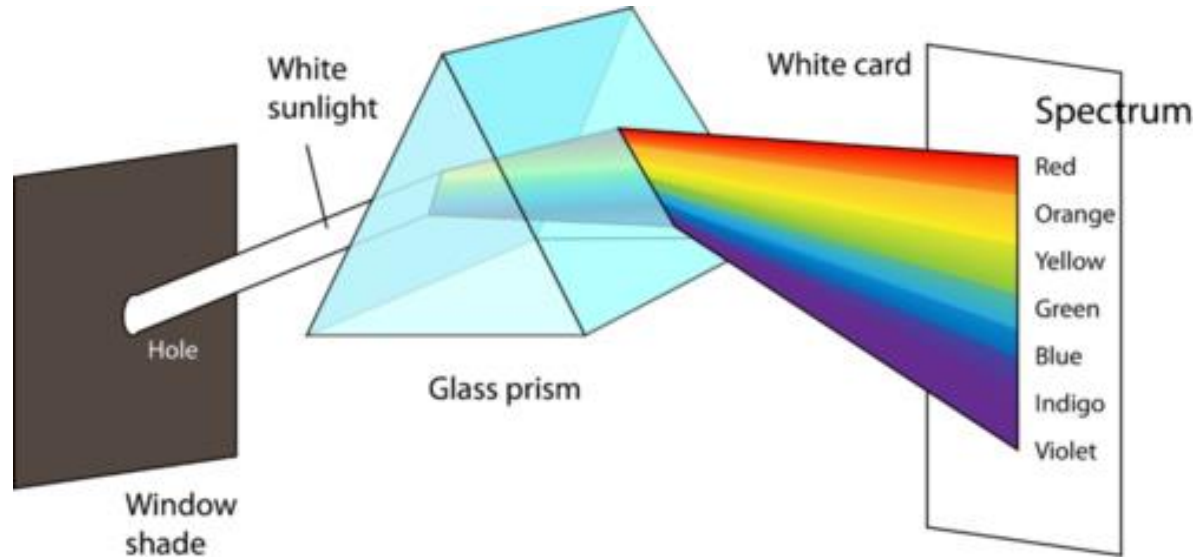
# Why study color?

- Fascinating and complicated phenomena
- Has kept scientist, psychologists, philosophers, and artists interested for years
- In terms of digital image processing
  - Image enhancement and manipulation – aesthetics, restoration, reproducing detail.
  - Image analysis – color is information!

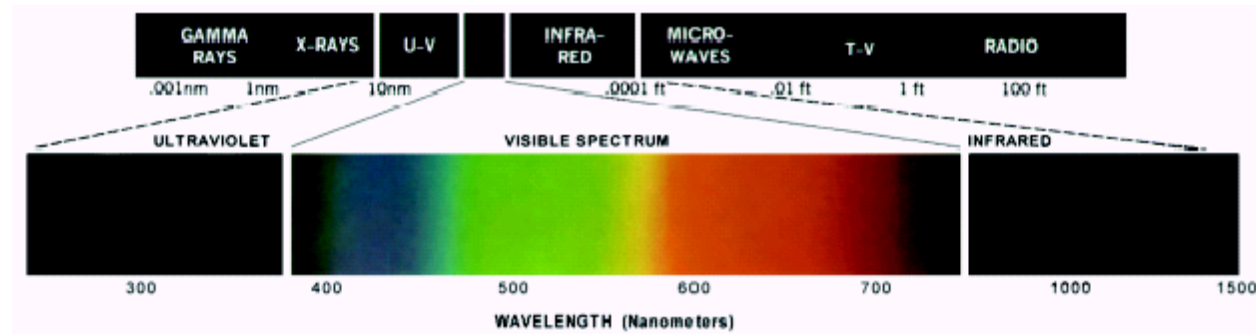
# What is Color?

- Physical Phenomenon
- Physiopsychological Phenomenon

# Color as a Physical Phenomenon



# Color as a Physical Phenomenon



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

# Physical Quantities

- **Radiance**: total amount of energy that flow from the light source, measured in **watts (W)**
- **Luminance**: amount of energy an observer *perceives* from a light source, measured in **lumens (lm)**
  - Far infrared light: high radiance, but 0 luminance
- **Brightness**: subjective descriptor that is hard to measure, similar to the achromatic notion of intensity

# What is Color?

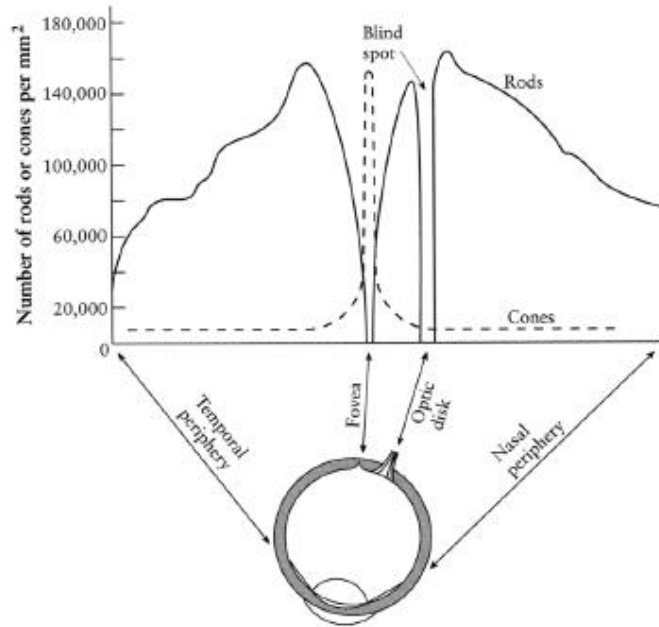
- Physical Phenomenon
- Physiopsychological Phenomenon

# Physiopsychological Phenomenon

- The eye and brain turn an incoming emission spectrum into a discrete set of values.
- The signal sent to our brain is interpreted as color.



# Biology of Vision

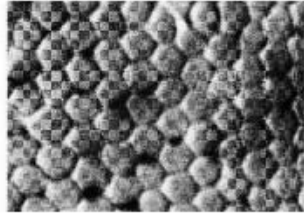


*Density of photoreceptors on the retina (Glassner, 1.4)*

- ♦ **Retina** - a layer of photosensitive cells covering 200° on the back of the eye.
  - **Cones** - responsible for color perception.
  - **Rods** - Limited to intensity (but 10x more sensitive).
- ♦ **Fovea** - Small region (1 or 2°) at the center of the visual axis containing the highest density of cones (and no rods).

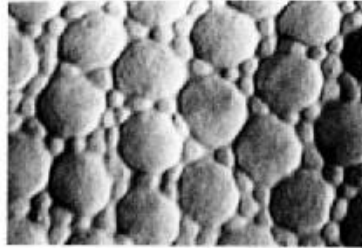
# Biology of Vision

In fovea

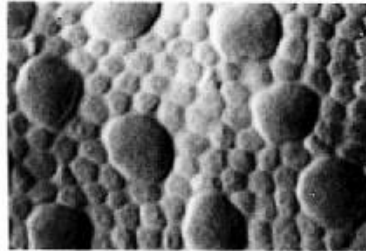


— 10  $\mu\text{m}$

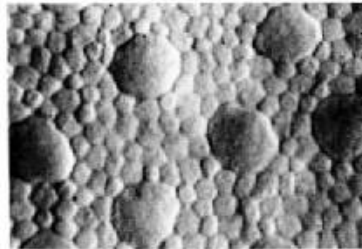
Near fovea



Farther



Farther still

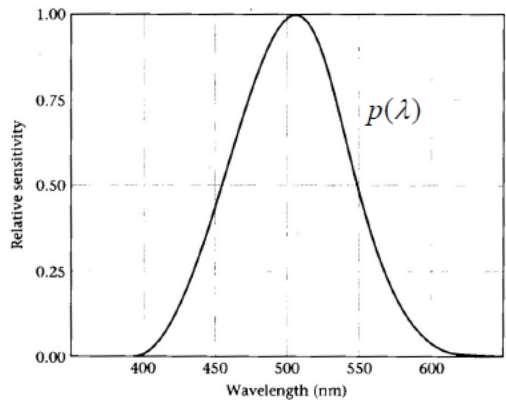


*Photomicrographs at increasing distances from the fovea. The large cells are cones; the small ones are rods. (Glassner, 1.5 and Wandell, 3.4).*

# Biology of Vision

**Photopigments** are the chemicals in the rods and cones that react to light. Can respond to a single photon!

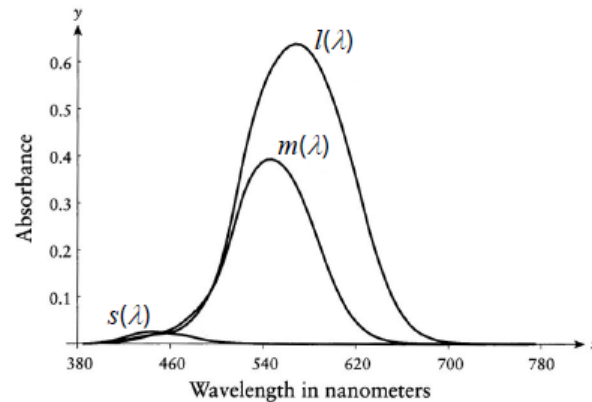
Rods contain **rhodopsin**, which has peak sensitivity at about 500nm.



*Rod sensitivity (Wandell, 4.6)*

Rods are active under low light levels, i.e., they are responsible for **scotopic** vision.

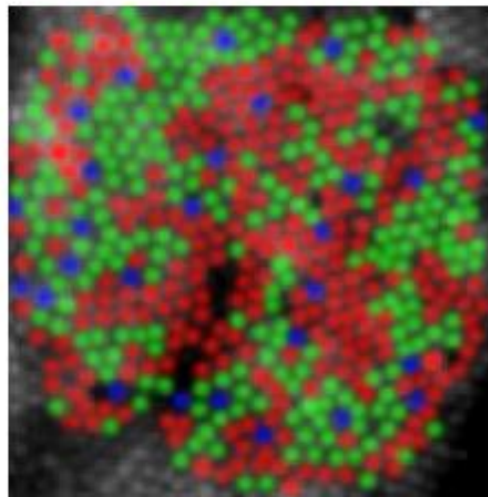
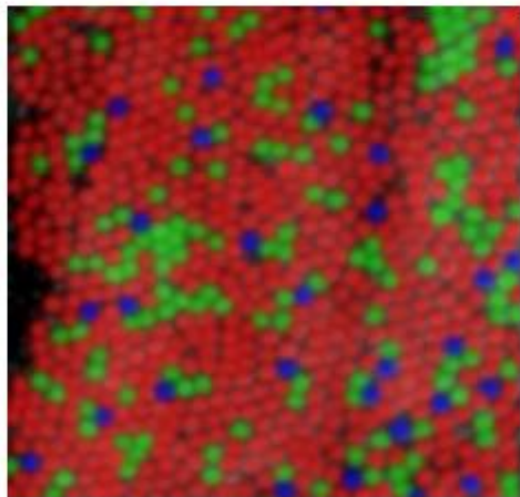
Cones come in three varieties: L, M, and S.



*Cone photopigment absorption (Glassner, 1.1)*

Cones are active under high light levels, i.e., they are responsible for **photopic** vision.

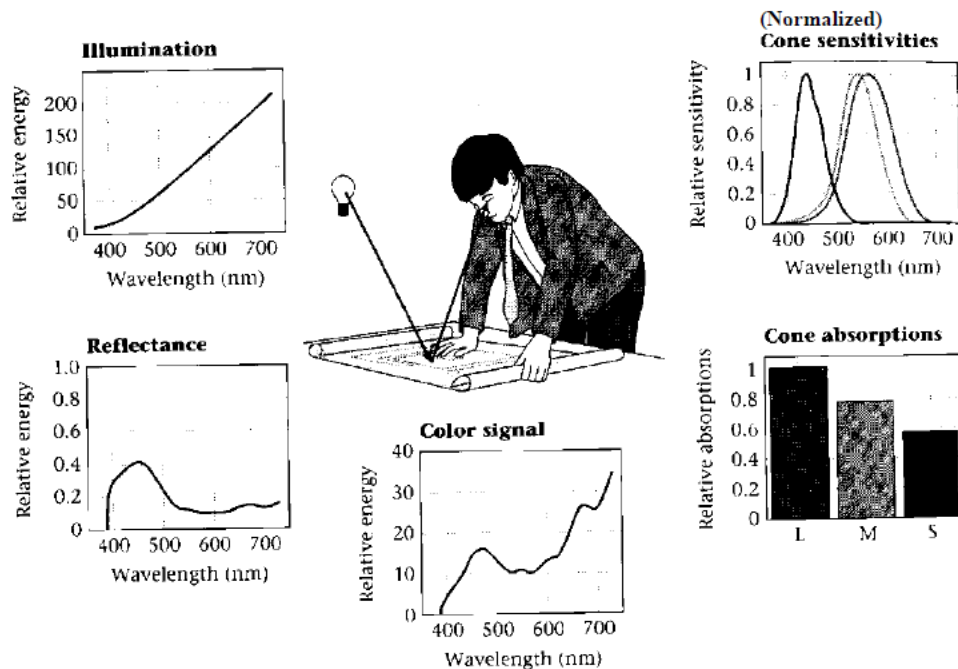
# Cone distribution



Here are images of near-fovea regions for two different human subjects, with colors to indicate the L (red), M (green) and S (blue) cones:

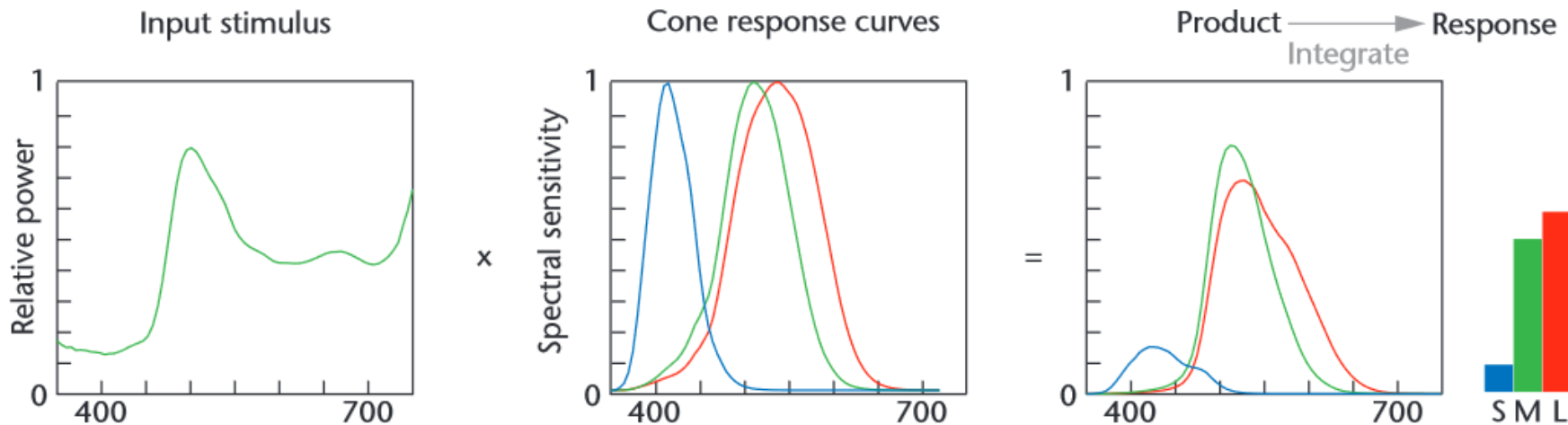
Remarkably, both subjects have normal color vision!

# Light source vs. reflected light



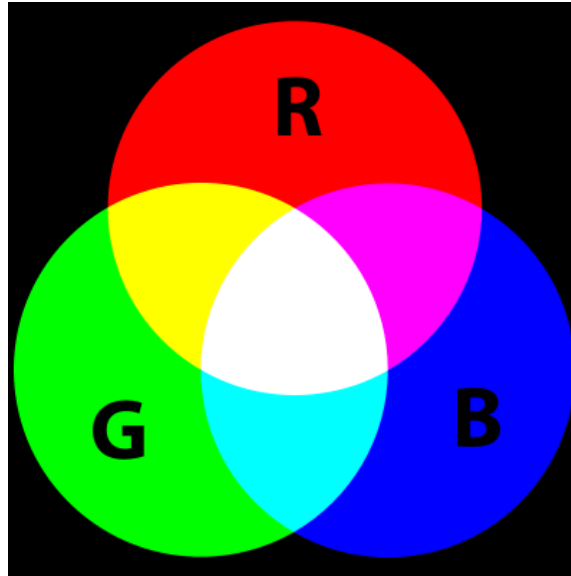
*How light and reflectance become cone responses (Wandell, 9.2)*

# Color signal to the brain



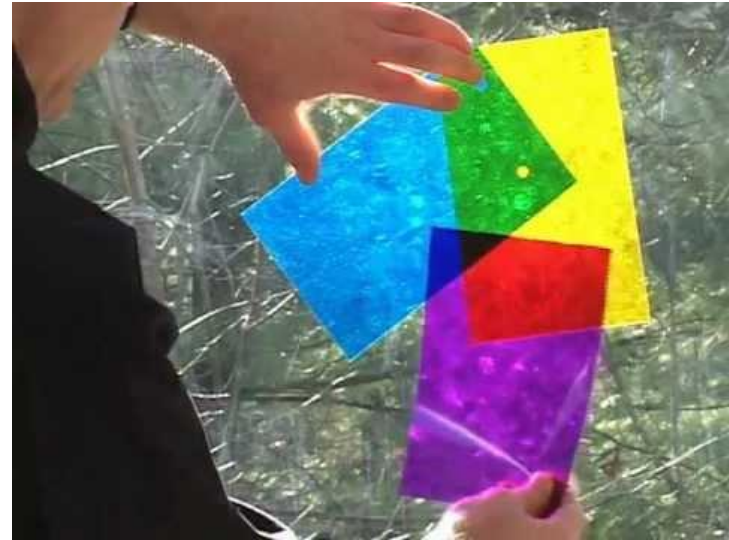
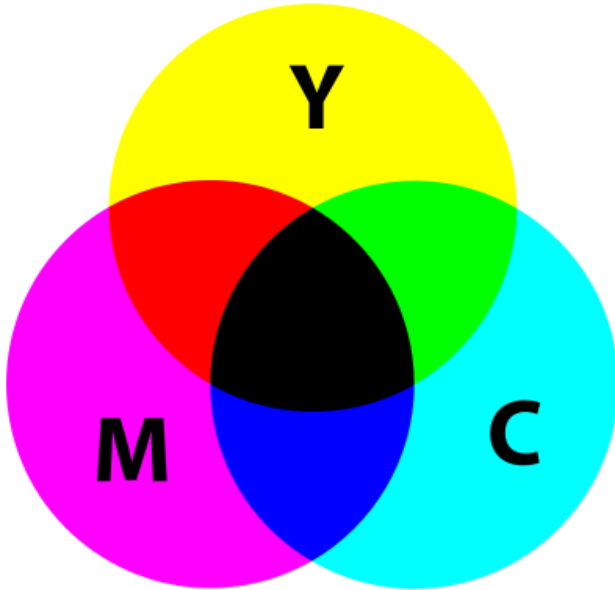
# Primary Colors (color as three numbers)

- Additive (CRT displays, projectors etc.)



# Primary Colors

- Subtractive (mixing of pigments or dyes)



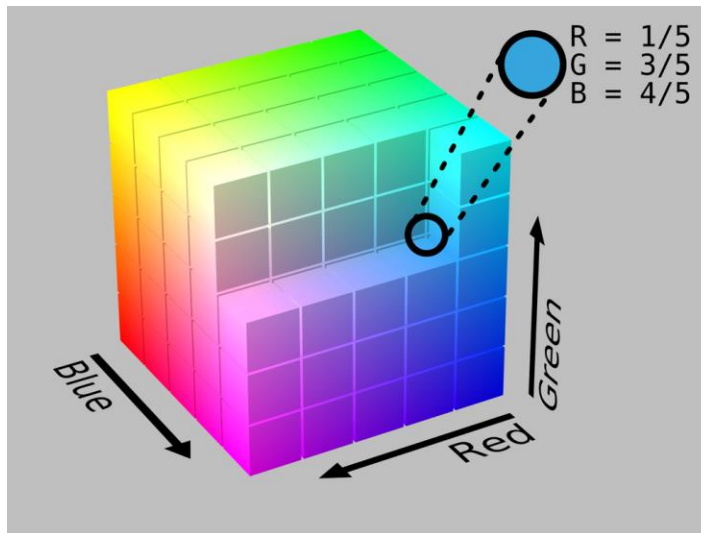


# Color Models

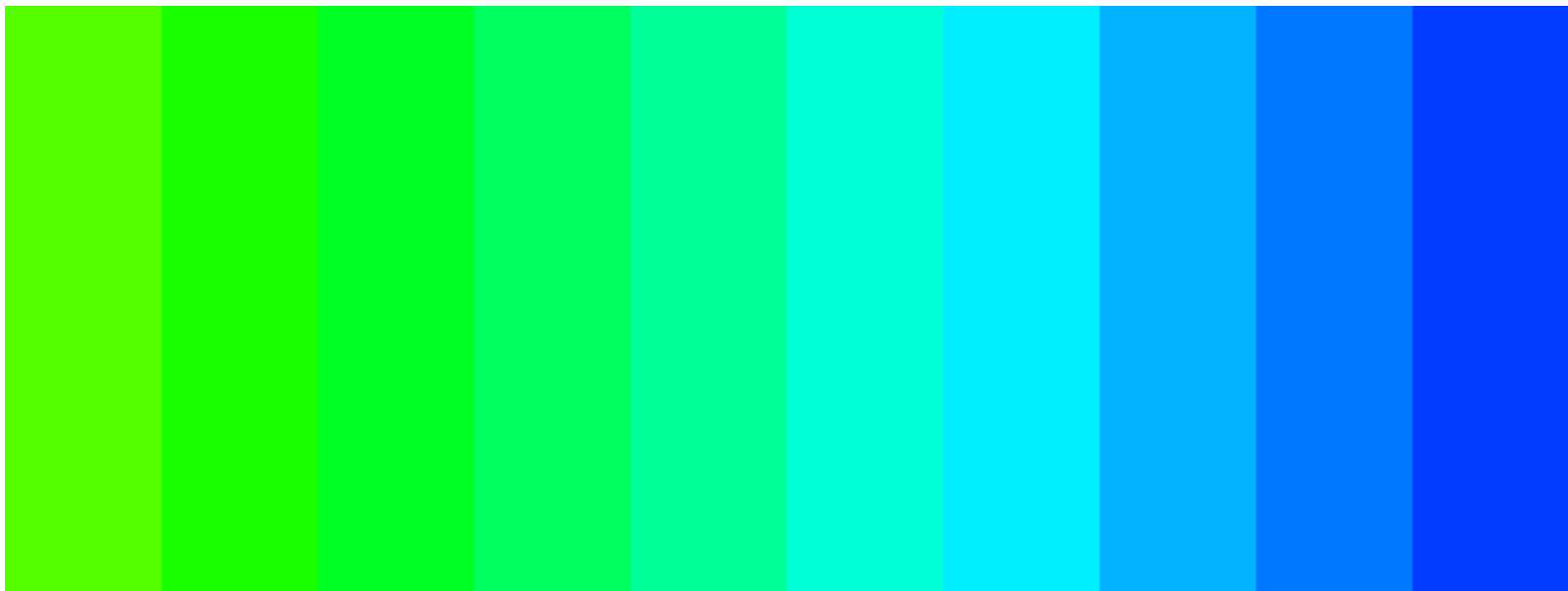
- RGB
- CIE XYZ
- HSI / HSY
- CIE LAB

# RGB color space

- Primary colors
- Additive color model  $f(x, y) = \alpha_1 R + \alpha_2 G + \alpha_3 B$
- Perceptually non uniform

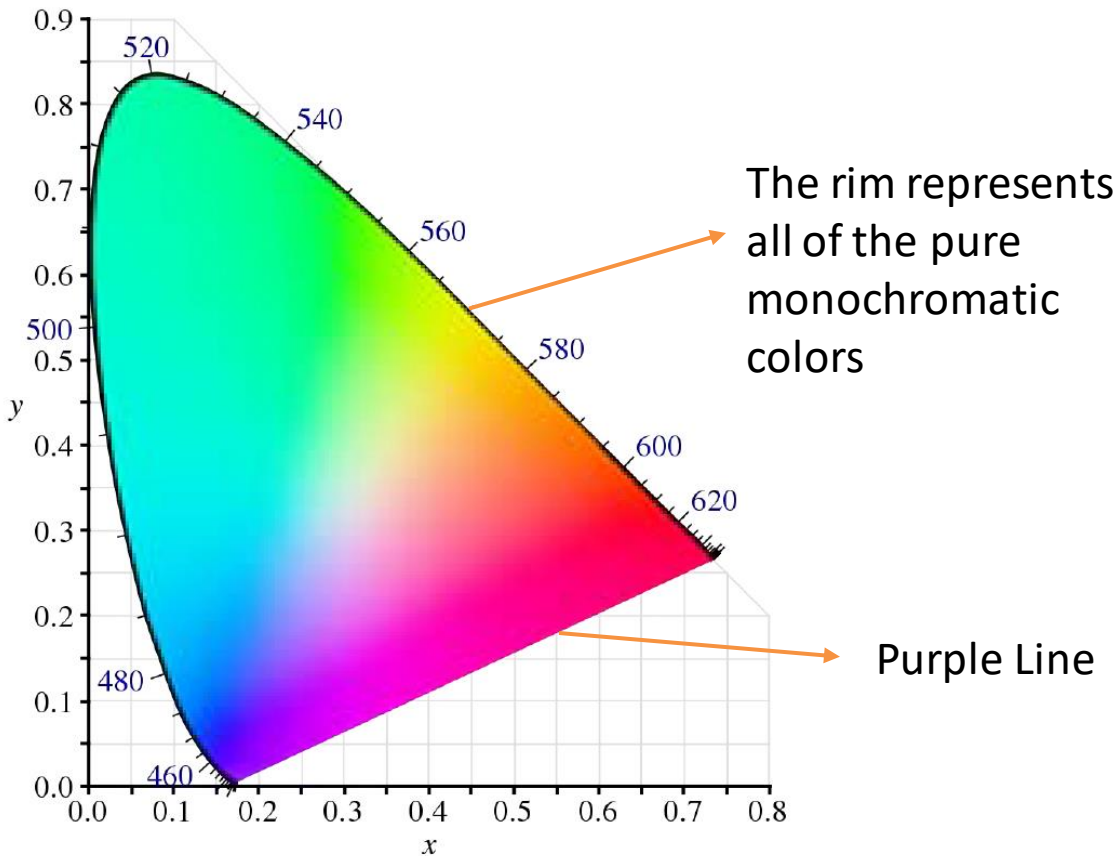


Courtesy: wikipedia

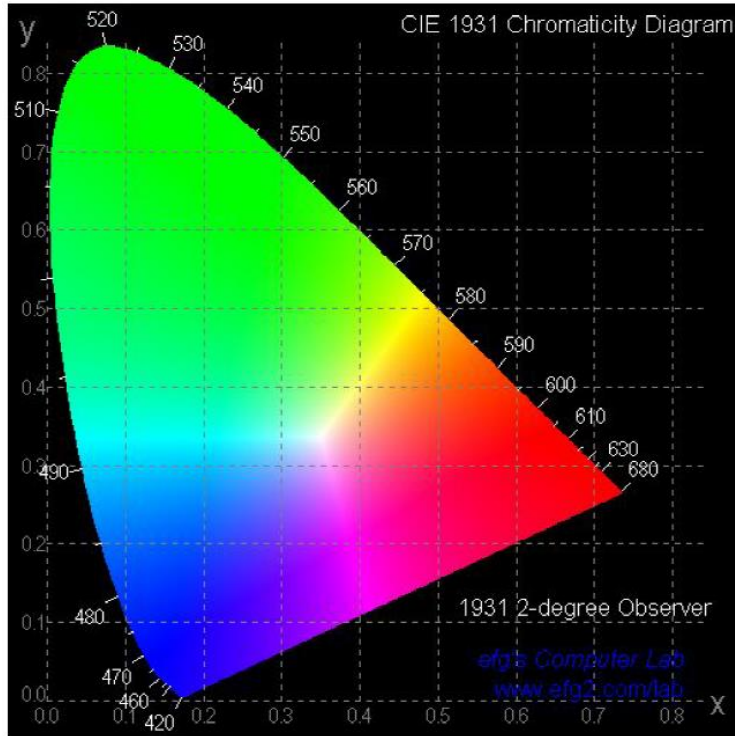


# CIE 1931 (x,y) chromaticity diagram

A convenient representation for color values, when we want to tease apart luminance and chromaticity, is therefore  $Y_{xy}$  (luminance plus the two most distinctive chrominance components)



# CIE 1931 (x,y) chromaticity diagram



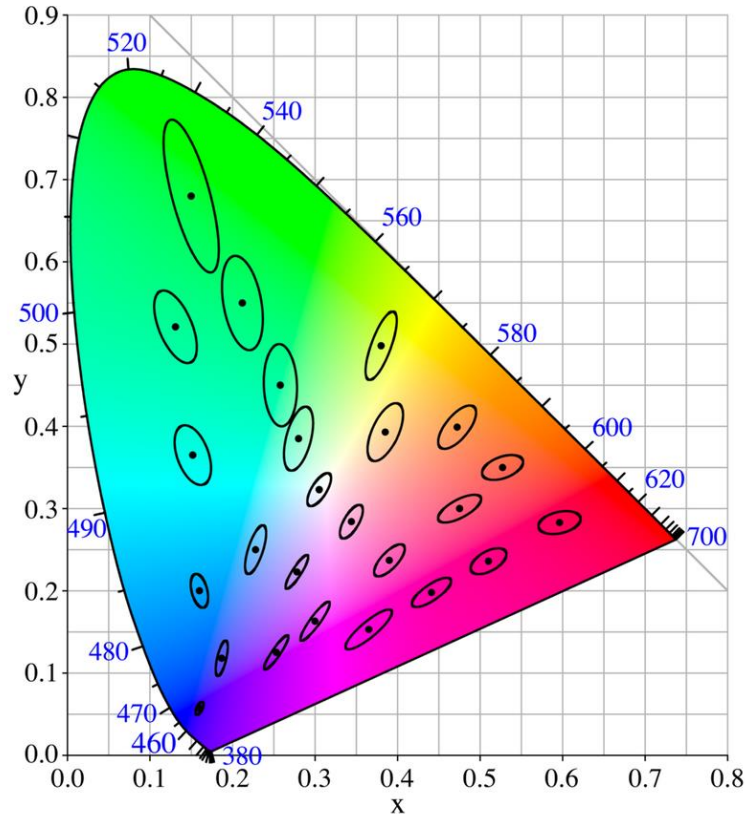
- Chromaticity coordinates:

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

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

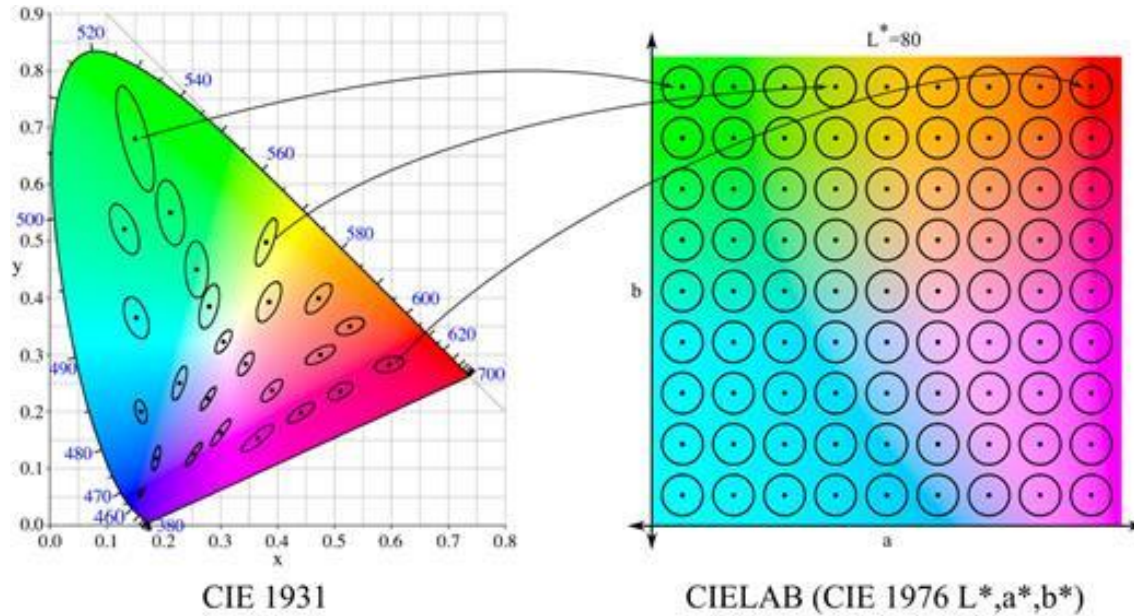
- x and y are chromaticity coordinates, Y is relative luminance
- Chromaticity coordinates discard the absolute intensity of a given color sample and just represent its pure color
- This figure shows the (x,y) value for every color value perceivable by most humans

# McAdam Ellipses



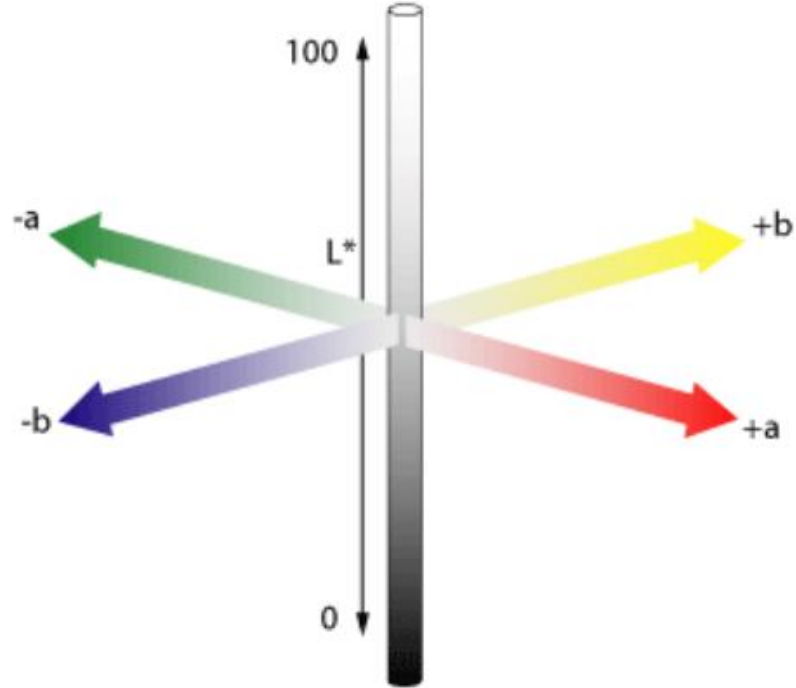
- **MacAdam ellipses** refer to the region on a chromaticity diagram which contains all colors which are indistinguishable, to the average human eye, from the color at the center of the ellipse
- The contour of the ellipse represents the **just noticeable differences** of chromaticity

# CIE Lab color space



Ideal scenario

# CIE Lab color space



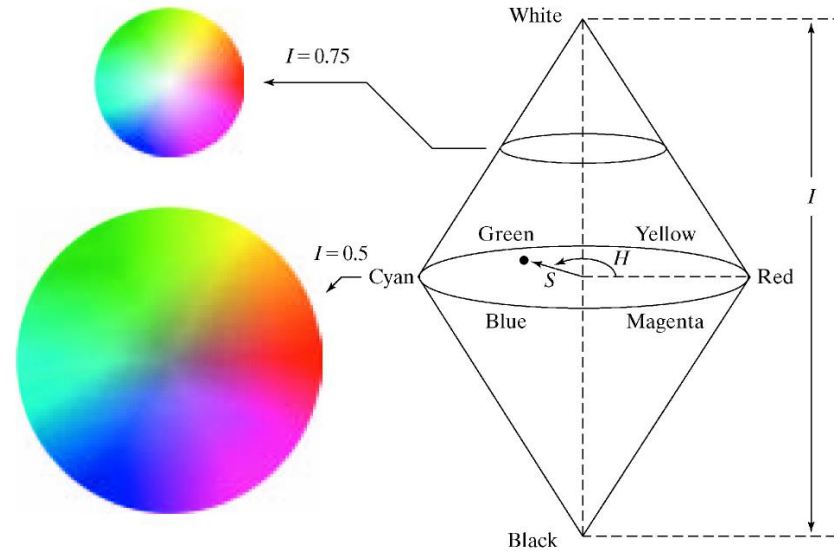
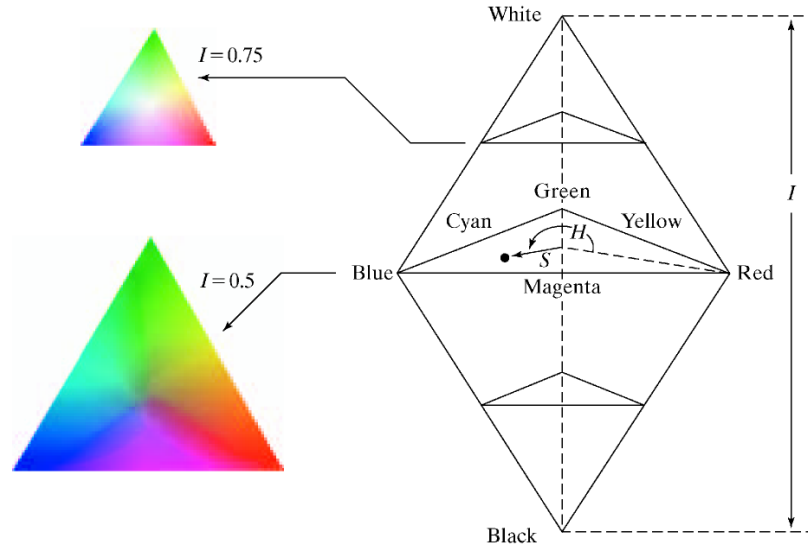


# Perceptually Uniform Color Spaces



<https://matplotlib.org/3.1.1/tutorials/colors/colormaps.html>

# HSI color space



# color space

- What color space do you think might have been used in re-coloring of Mughal-e-Azam (1960)?



The colourisation team spent 18 months developing software for colouring the frames, called "Effects Plus", which was designed to accept only those colours whose [hue](#) would match the shade of grey present in the original film. This ensured that the colours added were as close to the real colour as possible;<sup>[113]</sup> the authenticity of the colouring was later verified when a costume used in the film was retrieved from a warehouse, and its colours were found to closely match those in the film. Every shot was finally hand-corrected to perfect the look.<sup>[116]</sup> The actual colourisation process took a further 10 months to complete.<sup>[113]</sup> The exact cost of the colourisation is disputed, with a wide variety of estimates ranging from ₹20 million (US\$290,000)<sup>[117]</sup> to ₹50 million,<sup>[46][118]</sup> or ₹100 million.<sup>[76]</sup>

# Mayabazar (1957), colorized (2007)

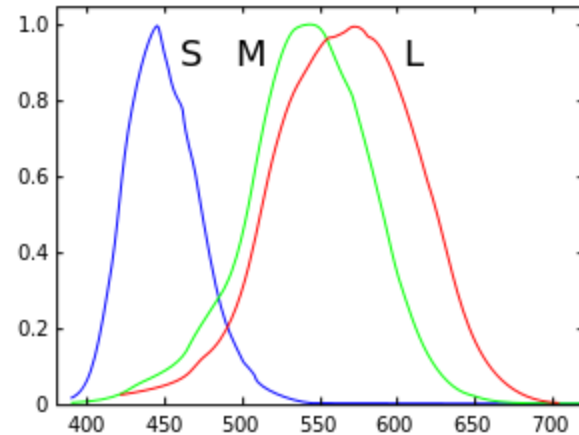


The Film Heritage Foundation announced in March 2015 that they would be restoring *Mayabazar*, along with a few other Indian films from 1931 to 1965, as a part of their restoration projects carried out in India and abroad in accordance with international parameters. **The foundation opposed digital colourisation, stating that they "believe in the original repair as the way the master or the creator had seen it"**

# LMS color space

- It is common to use the LMS color space when performing **chromatic adaptation** (estimating the appearance of a sample under a different illuminant)
- It's also useful in the study of color blindness, when one or more cone types are defective.

$$\begin{bmatrix} L \\ M \\ S \end{bmatrix} = \begin{bmatrix} 0.7328 & 0.4296 & -0.1624 \\ -0.7036 & 1.6975 & 0.0061 \\ 0.0030 & 0.0136 & 0.9834 \end{bmatrix} \begin{bmatrix} X \\ Y \\ Z \end{bmatrix}$$



# White Balancing



Courtesy: [wahlmanphotography.com](http://wahlmanphotography.com)



Courtesy: [wallcreations.com.au](http://wallcreations.com.au)



# White Balancing





# White Balancing



# White Balancing



```
im = double(imread('lighthouse.jpg'));
```

```
RGBw = [246 169 87];
```

```
im1(:, :, 1) = im(:, :, 1) * 255 / RGBw(1);
```

```
im1(:, :, 2) = im(:, :, 2) * 255 / RGBw(2);
```

```
im1(:, :, 3) = im(:, :, 3) * 255 / RGBw(3);
```

# Von Kries Method

- Scaling operation is performed in LMS space

$$\begin{bmatrix} L \\ M \\ S \end{bmatrix} = \begin{bmatrix} 1/L'_w & 0 & 0 \\ 0 & 1/M'_w & 0 \\ 0 & 0 & 1/S'_w \end{bmatrix} \begin{bmatrix} L' \\ M' \\ S' \end{bmatrix}$$

# Von Kries Method



# White Balancing

Incandescent lighting



Fluorescent lighting



Sunlight



Camera Flash



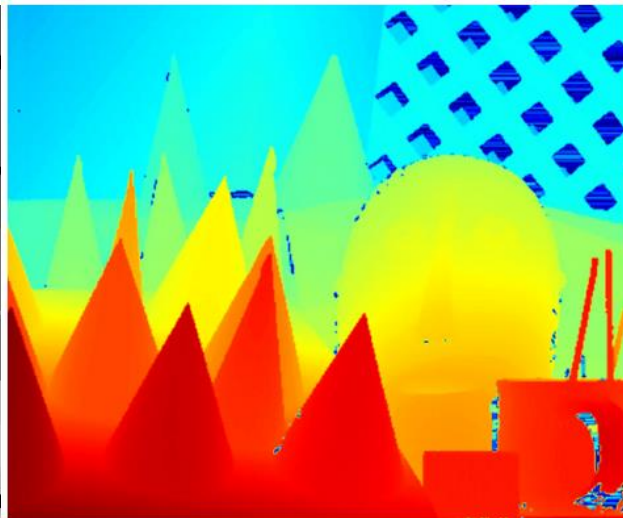
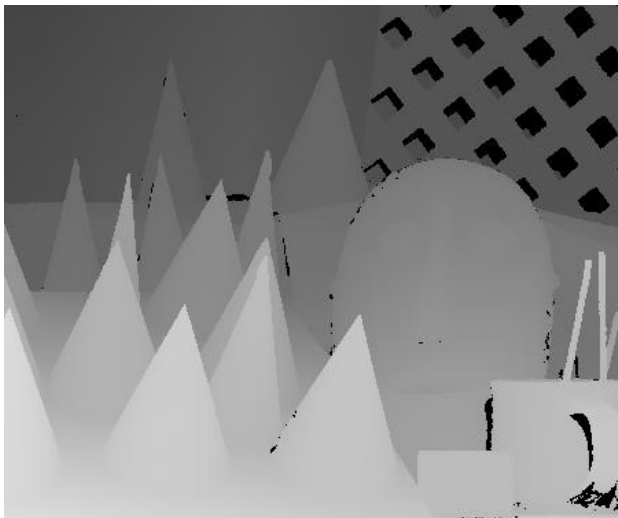
Cloudy



Shadow

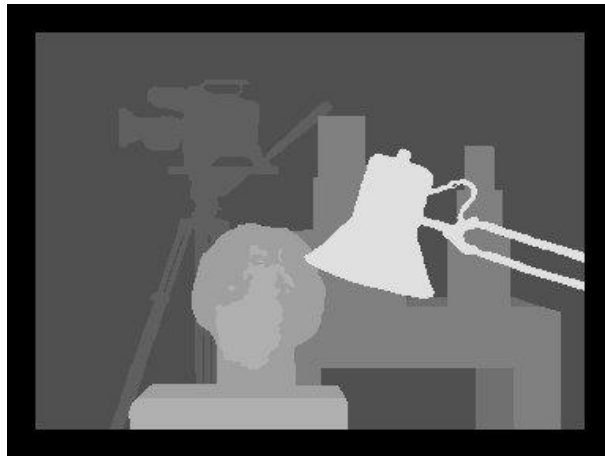


# Pseudo color Image Processing

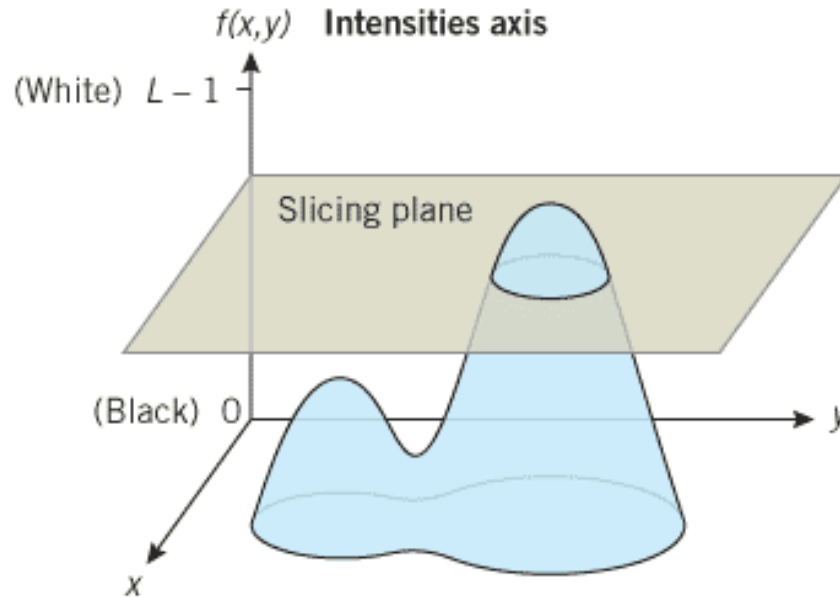




# Pseudo color Image Processing



# Pseudo color Image Processing (Intensity Slicing)



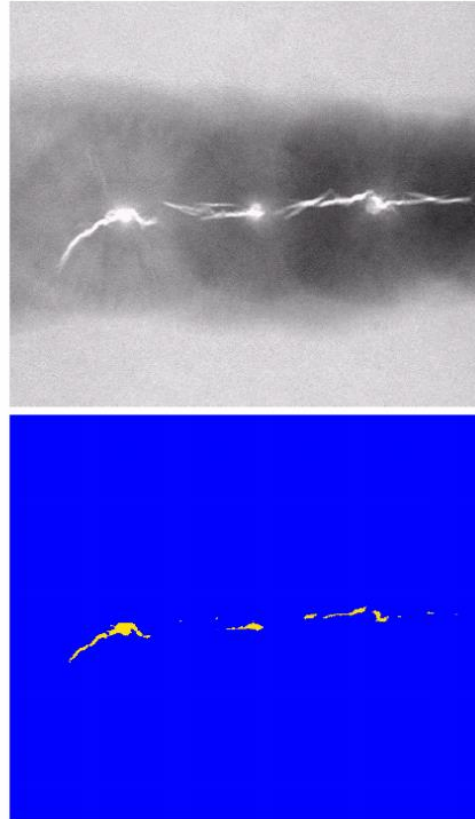


# Pseudo color Image Processing (Intensity Slicing)

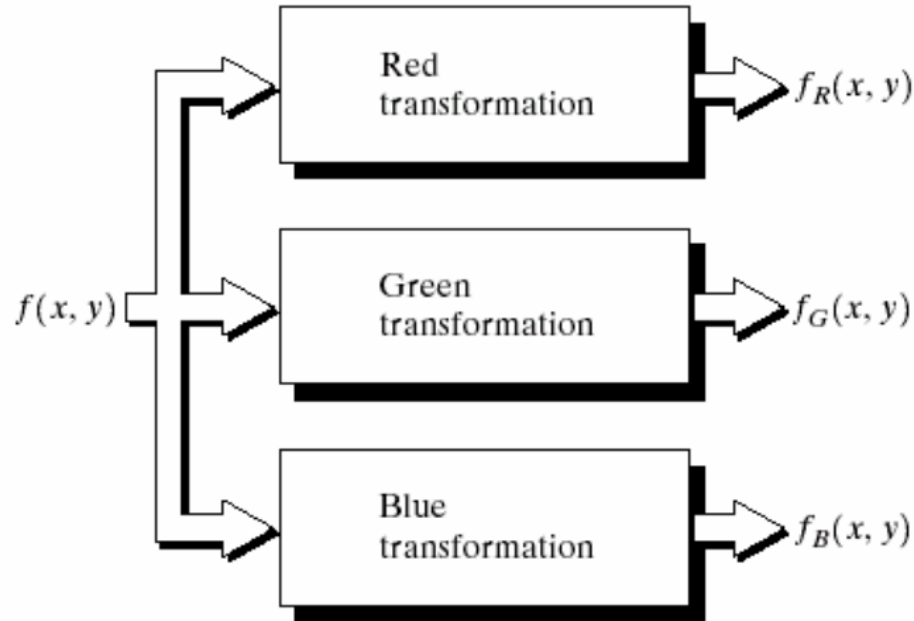
a  
b

**FIGURE 6.21**

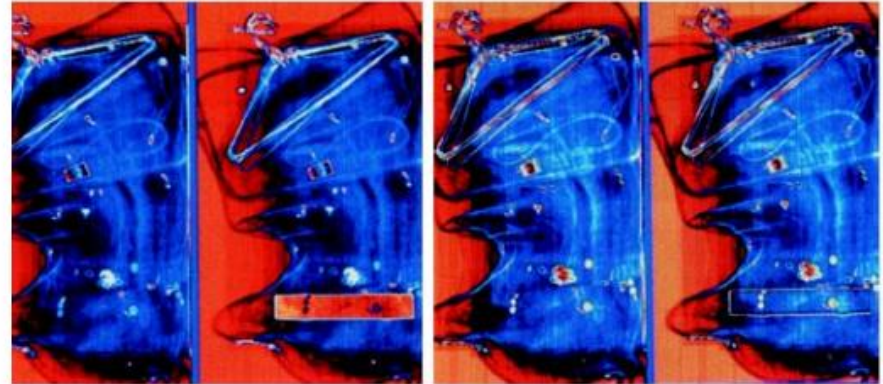
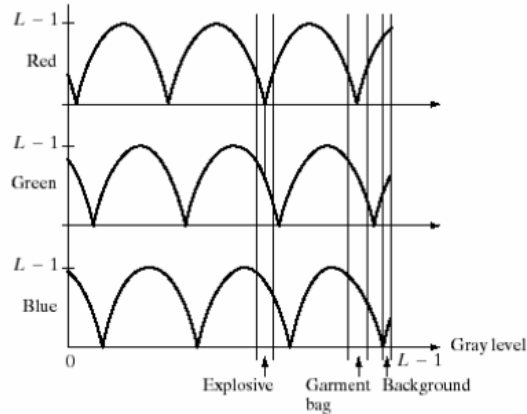
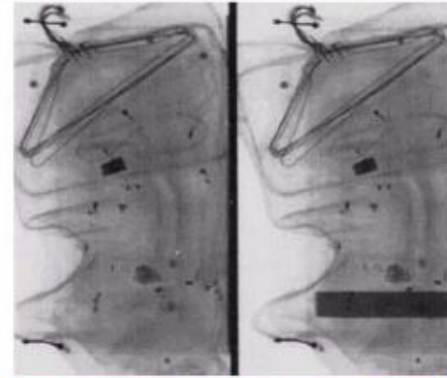
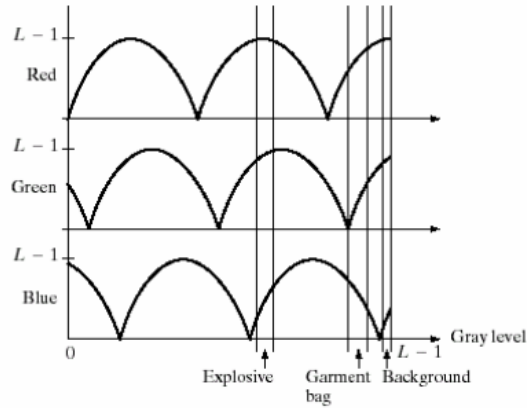
(a) Monochrome X-ray image of a weld. (b) Result of color coding. (Original image courtesy of X-TEK Systems, Ltd.)



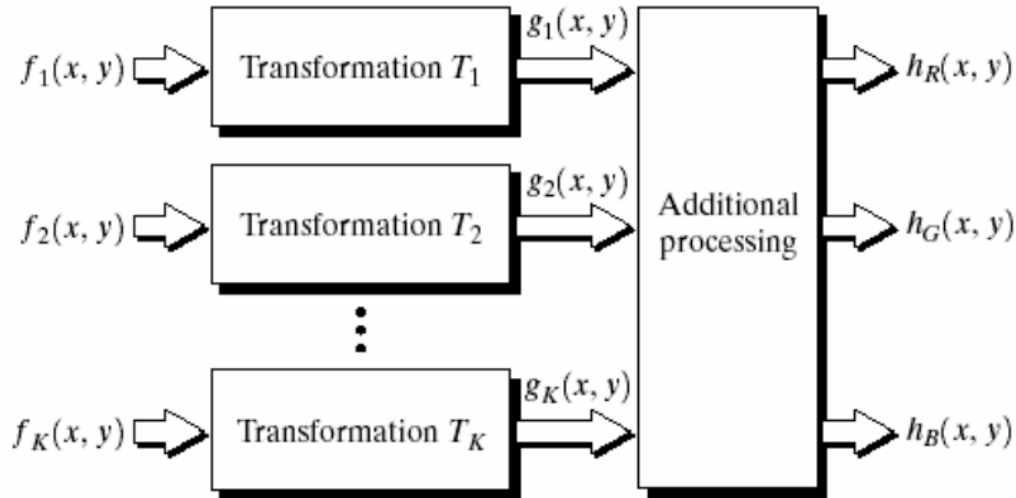
# Pseudo color Image Processing (Transformations)



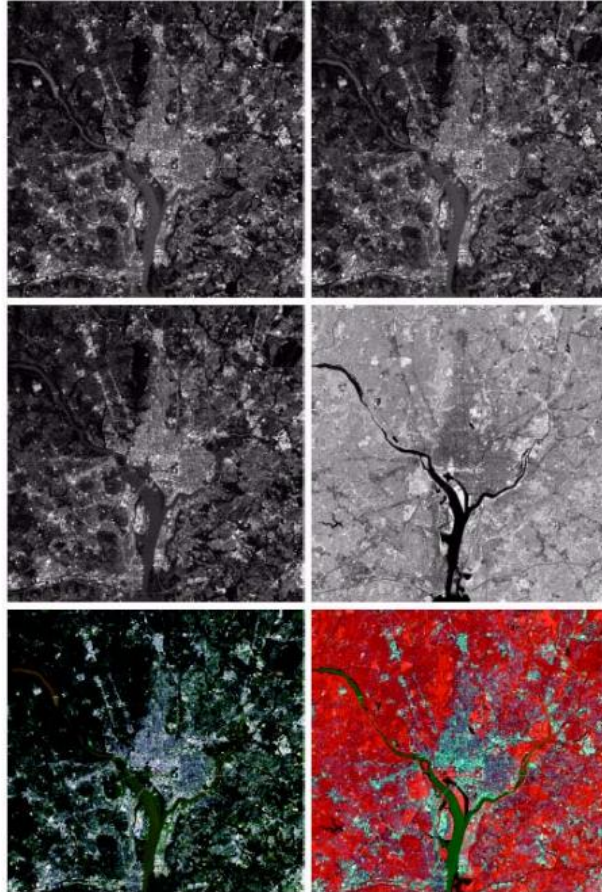
# Pseudo color Image Processing (Transformations)



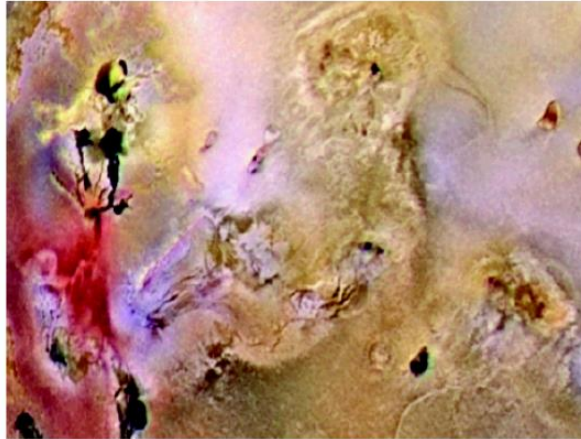
# Pseudo color Image Processing (Multi Spectral)



# Pseudo color Image Processing (Multi Spectral)



# Pseudo color Image Processing (Multi Spectral)



# RGBA space

- A (alpha) for transparency (important in image editing)



$$I_{out} = \alpha I_{foreground} + (1 - \alpha) I_{background}$$



# Trending applications: Image enhancement in RGB





# Example: Vintage effect



# Example: Vintage effect

```
im = double(imread('bike.jpg'));
```

```
% Extract each colour plane
```

```
R = im(:, :, 1); % Red
```

```
G = im(:, :, 2); % Green
```

```
B = im(:, :, 3); % Blue
```

```
% Create sepia tones for each channel
```

```
%(these number can be edited to create different styles)
```

```
outR= (R * .293) + (G * .769) + (B * .210);
```

```
outG = (R * .249) + (G * .686) + (B * .188);
```

```
outB = (R * .172) + (G * .534) + (B * .151);
```



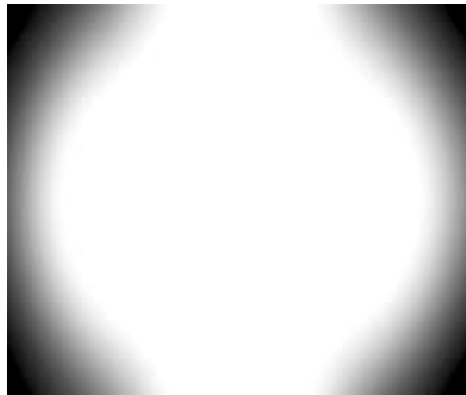
# Example: Vignetting effect

```
texture = imread(texture_path);  
texture = imresize(texture,[size(out,1) size(out,2)]);  
texture = double(rgb2gray(texture))/255;
```

```
out1(:,:,1) = double(out(:,:,1)) .* double(texture);  
out1(:,:,2) = double(out(:,:,2)) .* double(texture);  
out1(:,:,3) = double(out(:,:,3)) .* double(texture);
```



×



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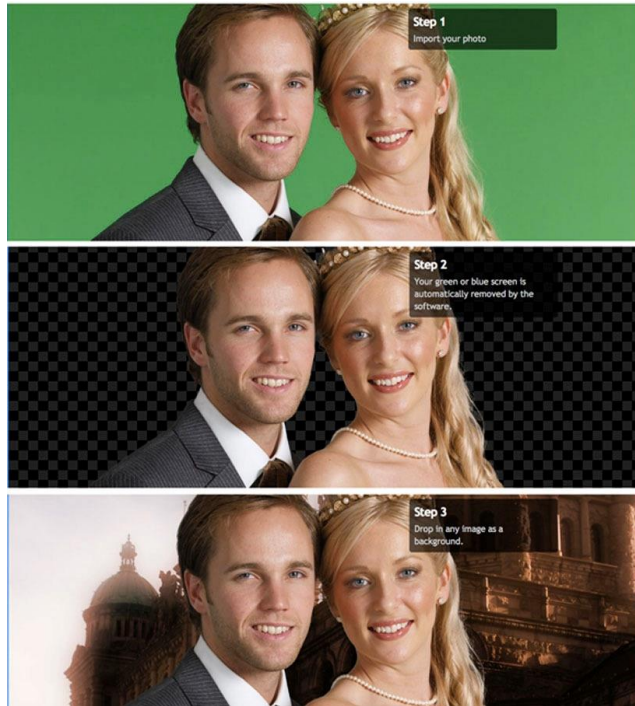
# Other such image effects

1. Change the transformation matrix, to suit the desired color tones
2. Choose or design different textures and blend them with original image
3. Repeat 1 and 2 in innovative ways





# Chroma Keying



# References

- “Colorimetry”, Ohta and Robertson, John Wiley and Sons Ltd