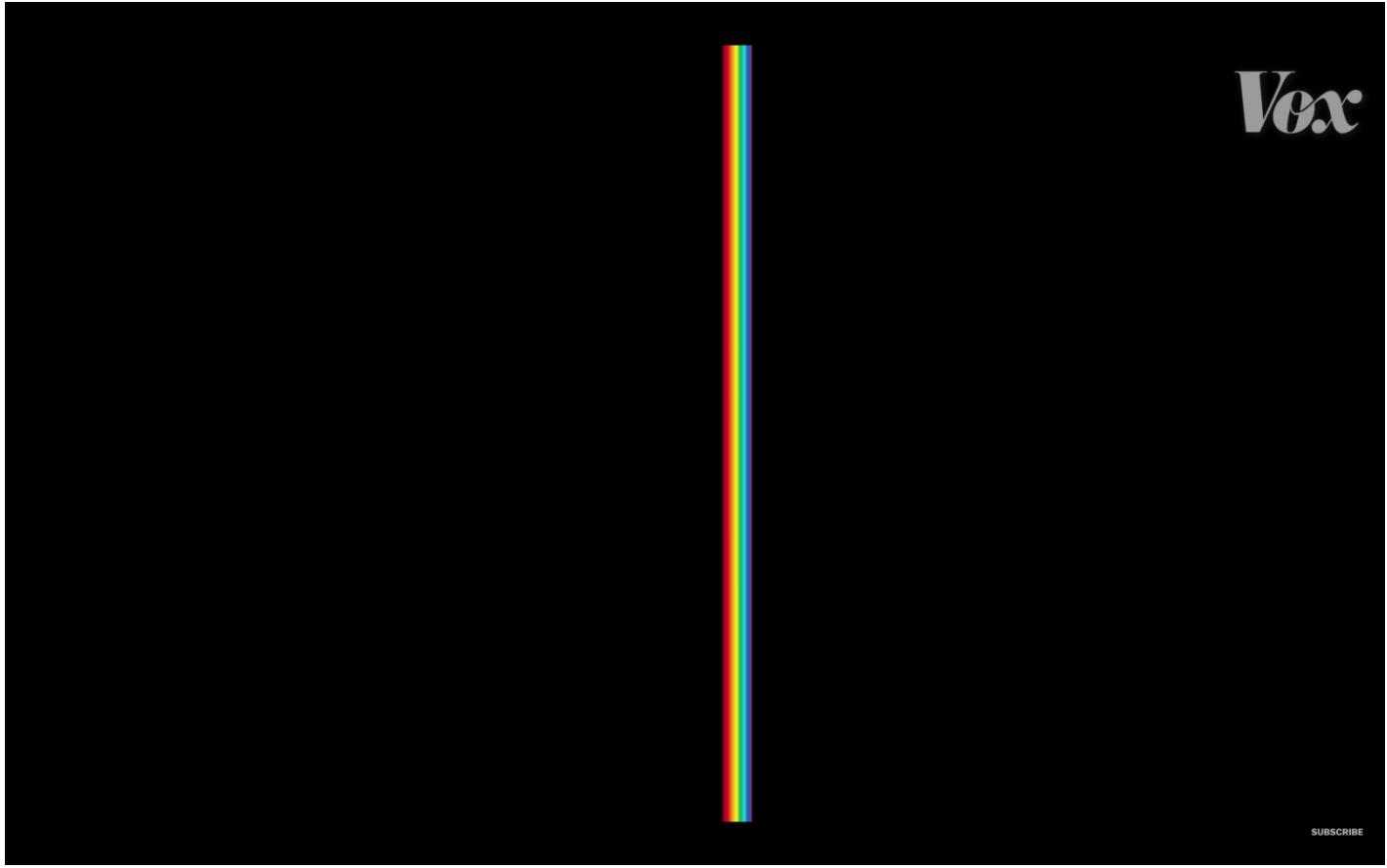




## Let Us Capture Some Points:



Vox

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### VISIBLE SPECTRUM

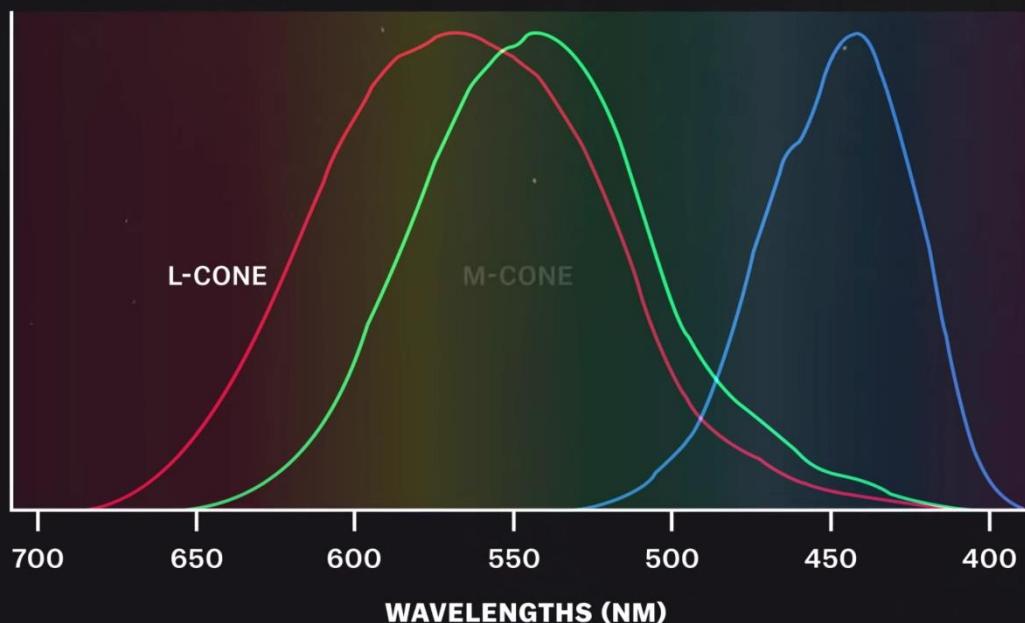


LONGER WAVELENGTH

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## RESPONSIVITY SPECTRA OF HUMAN CONE CELLS

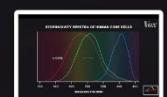
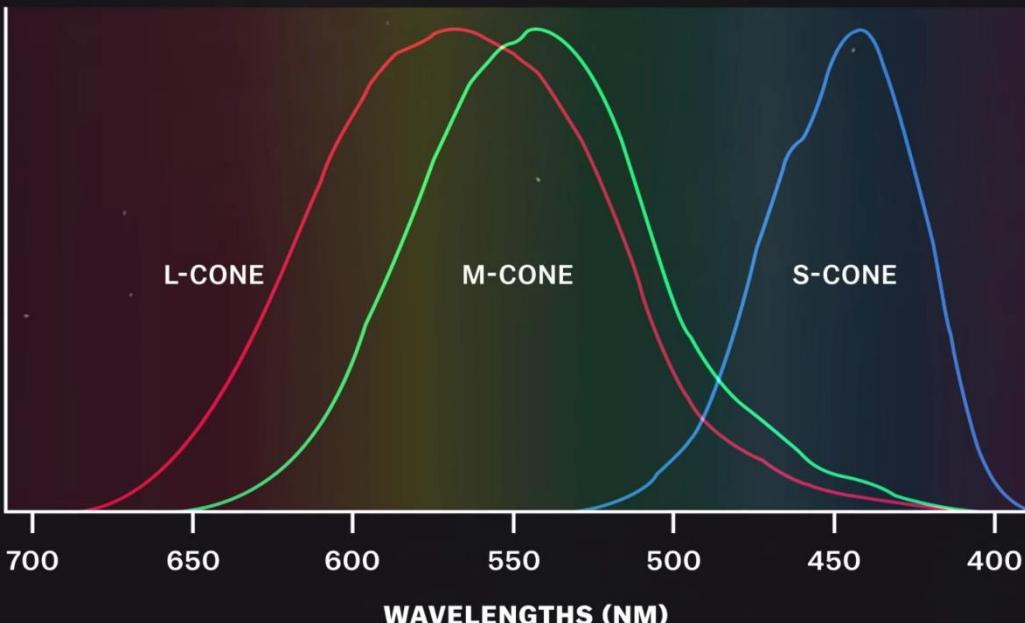
Vox



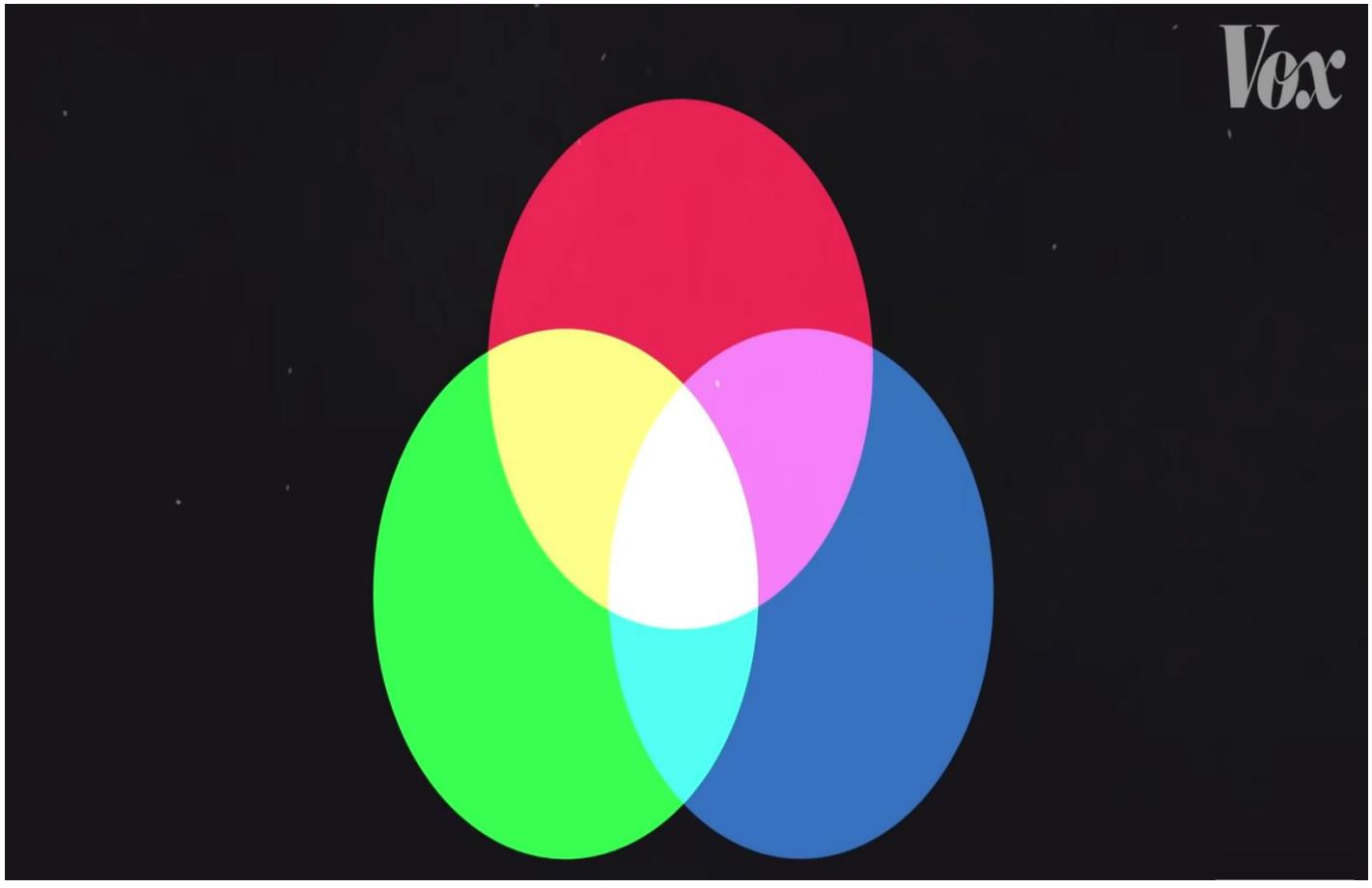
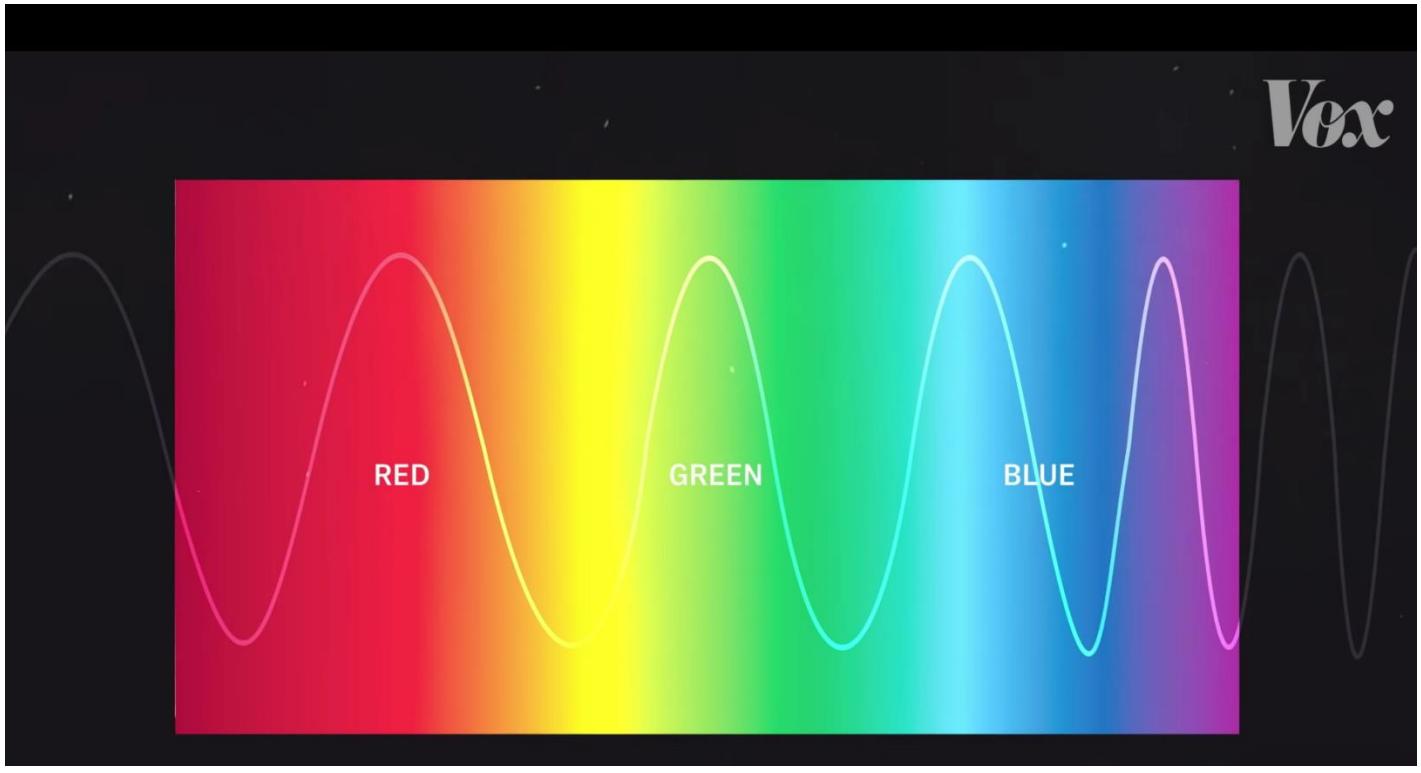
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## RESPONSIVITY SPECTRA OF HUMAN CONE CELLS

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How scientists colorize photos of space

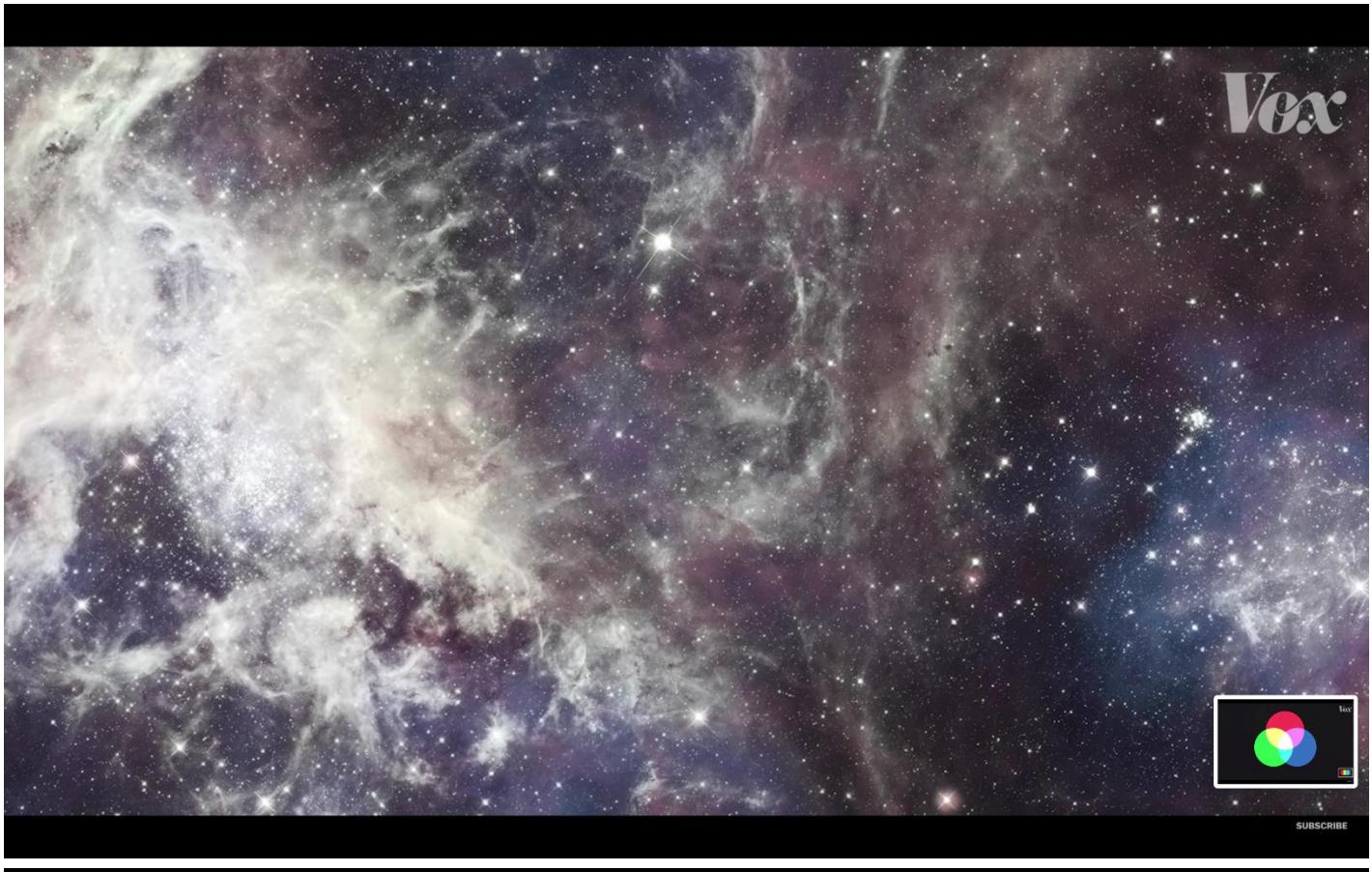
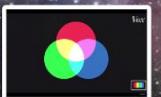
Vox



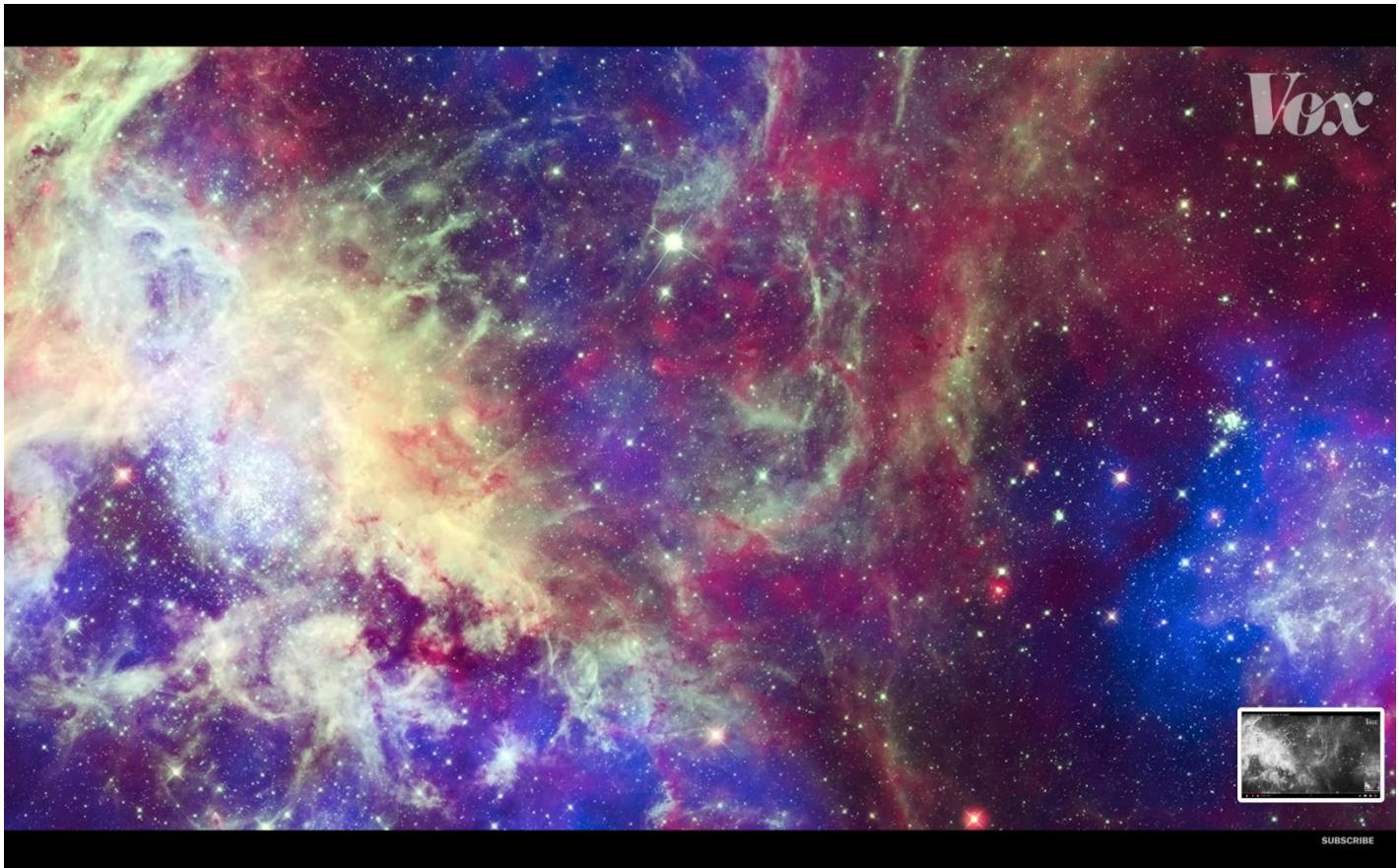
Vox



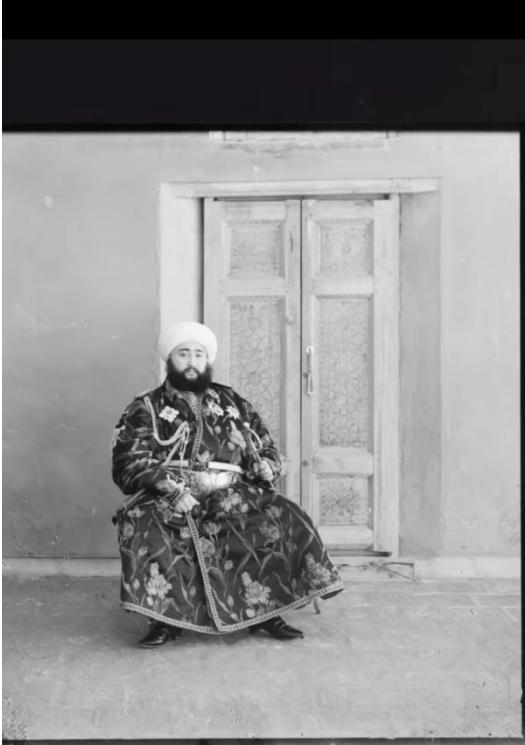
SUBSCRIBE

**Vox**

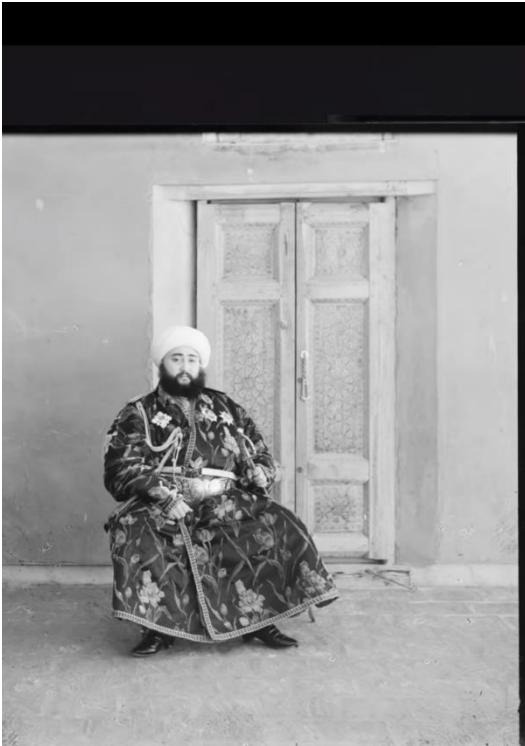
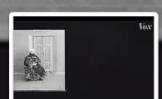
SUBSCRIBE

**Vox**

SUBSCRIBE

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SUBSCRIBE

**Vox**

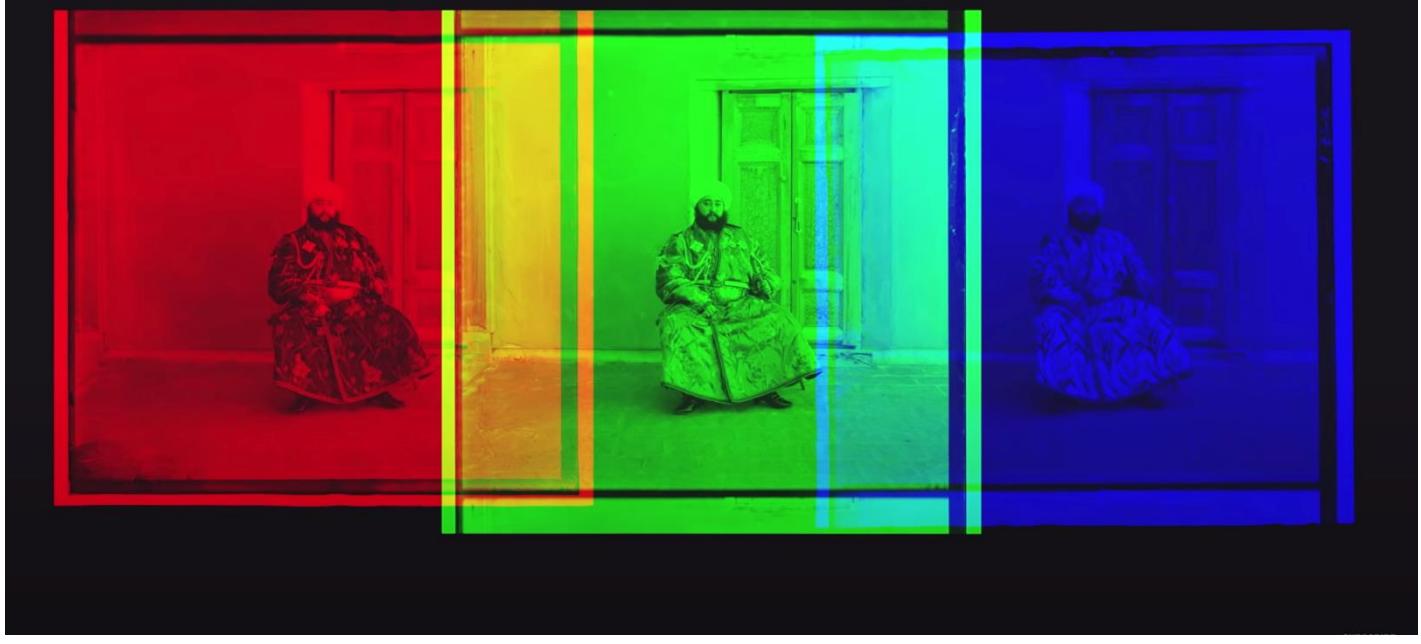
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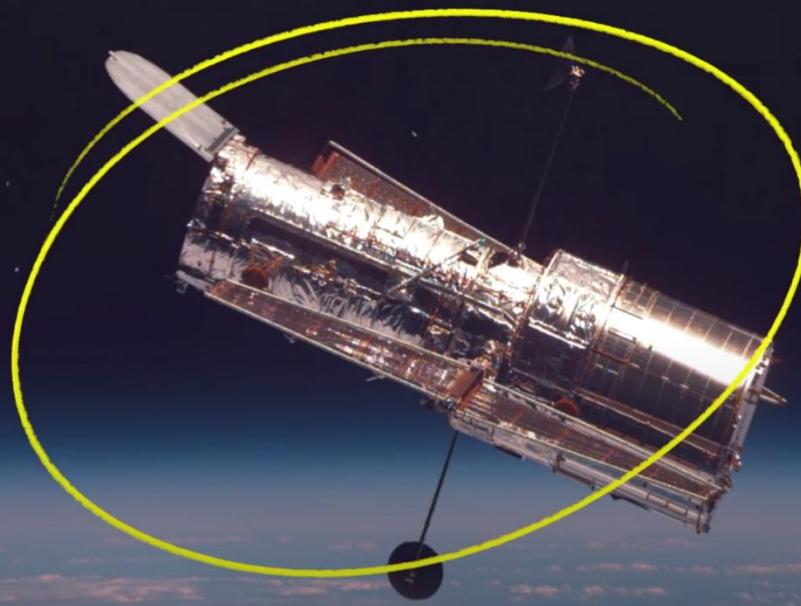


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## THE HUBBLE SPACE TELESCOPE



How scientists colorize photos of space

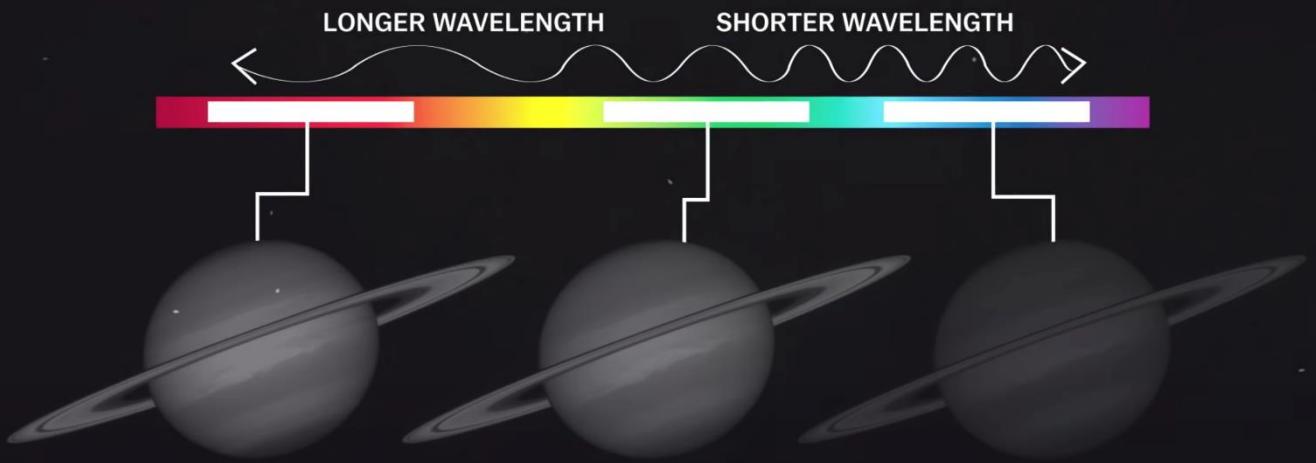
Vox

## BUBBLE NEBULA (NGC 7635)

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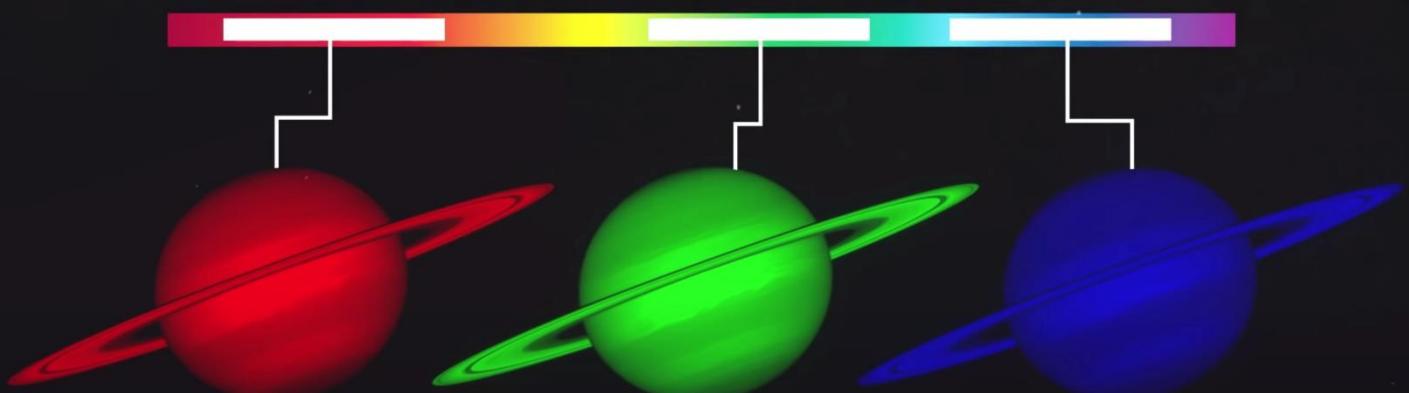
How scientists colorize photos of space

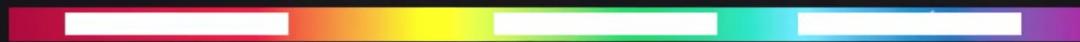
Vox



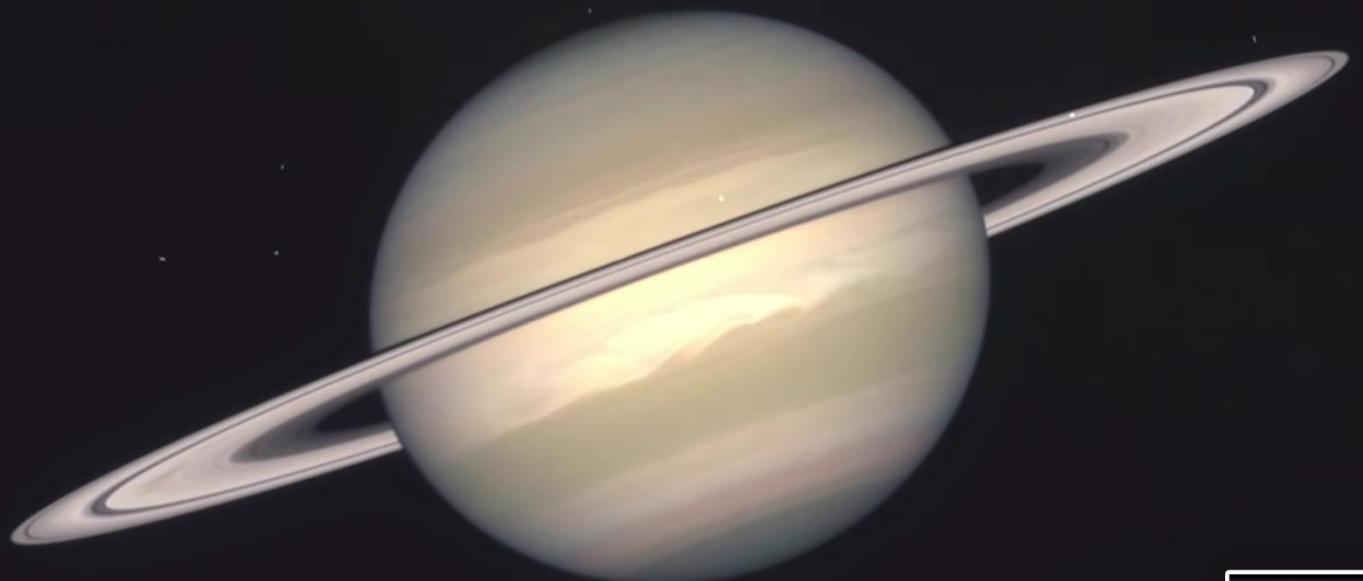
How scientists colorize photos of space

Vox



**Vox**

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Vox

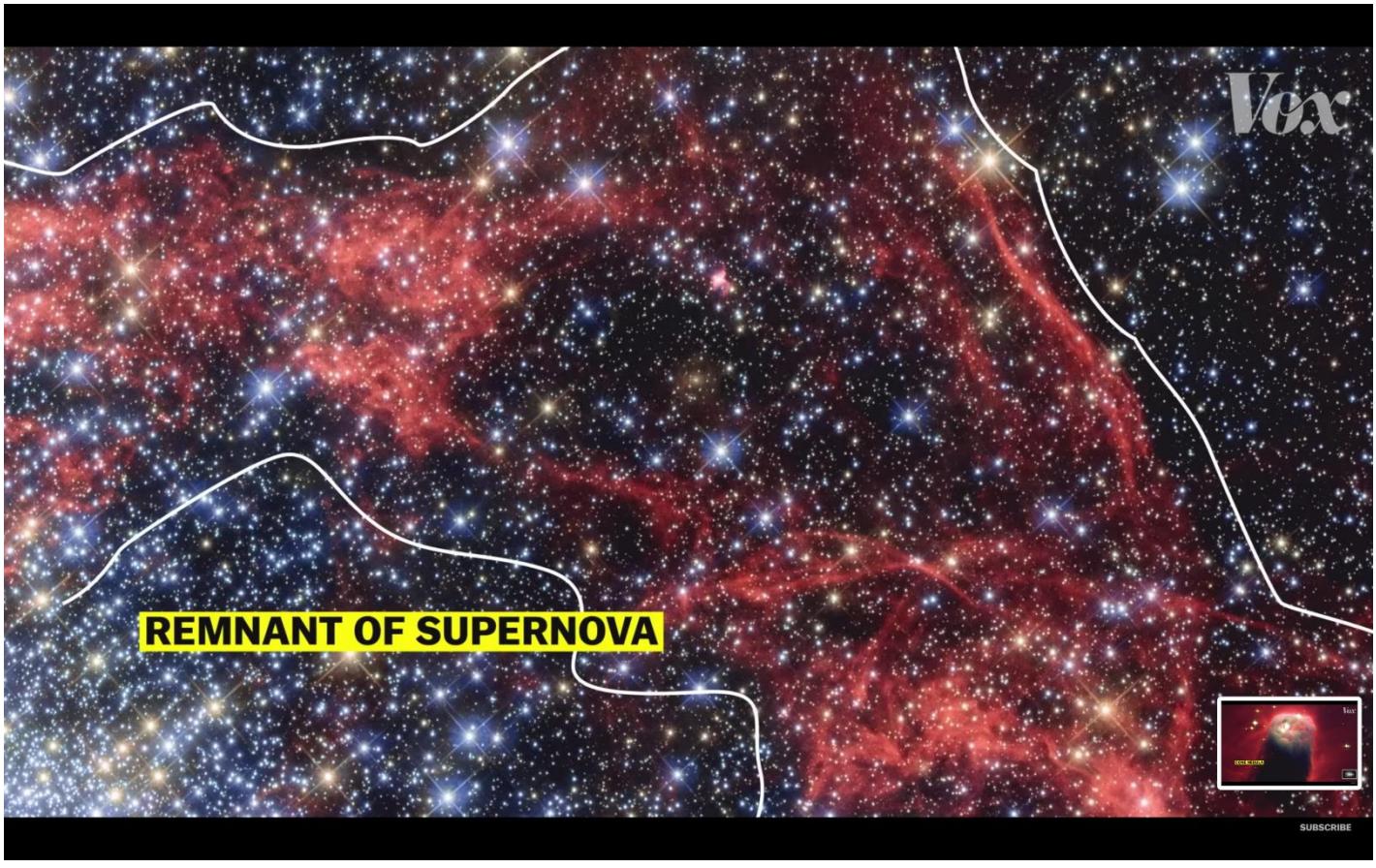
## SOMBRERO GALAXY

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## CONE NEBULA

SUBSCRIBE





SUBSCRIBE

**HYDROGEN****SULFUR****OXYGEN**

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## A. Color fundamentals

### Why use color in image processing?

The human visual system can distinguish hundreds of thousands of different color shades and intensities, but only around 100 shades of grey. Therefore, in an image, a great deal of extra information may be contained in the color, and this extra information can then be used to simplify image analysis, e.g. object identification and extraction based on color.

Three independent quantities are used to describe any particular color. The *hue* is determined by the dominant wavelength. Visible colors occur between about 400nm (violet) and 700nm (red) on the electromagnetic spectrum, as shown in figure below.

- Color is a powerful descriptor
- Object identification and extraction
- eg. Face detection using skin colors
- Humans can discern thousands of color shades and intensities
- Two category of color image processing

**Full color processing:** Images are acquired from full-color sensor or equipment's

**Pseudo-color processing:** In the past decade, color sensors and processing hardware are not available

Colors are assigned to a range of monochrome intensities

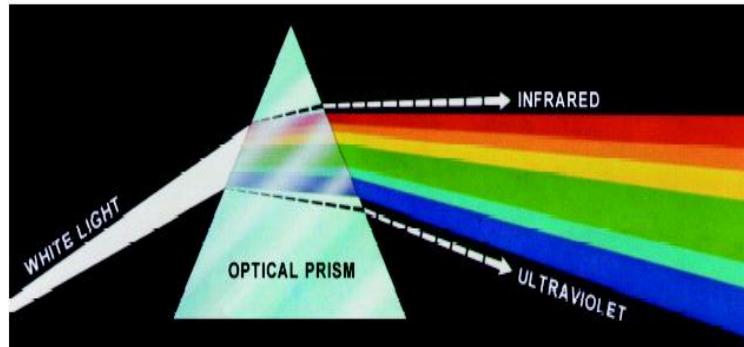
**Physical phenomenon:** Physical nature of color is known

**physio-psychological phenomenon:** How human brain perceive and interpret color?

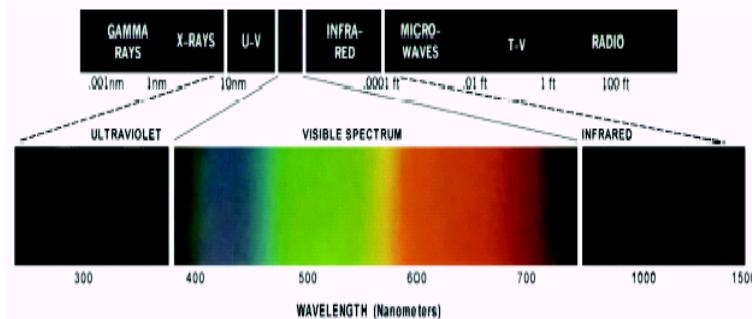
**Sir Isaac Newton (1666) —**

**Chromatic light span the electromagnetic spectrum (EM) from 400 to 700 nm**

Developed the prism theory for color of light



**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.)

## Illuminance of Light

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

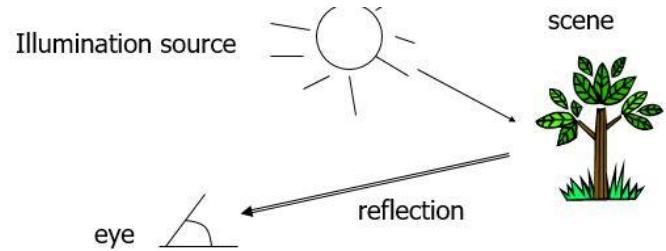
Physical quantities that describe light:

**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.

*Far infrared light:* high radiance, but 0 luminance

**Brightness:** subjective descriptor that is hard to measure, similar to the achromatic notion of intensity.



## How human eyes sense light?

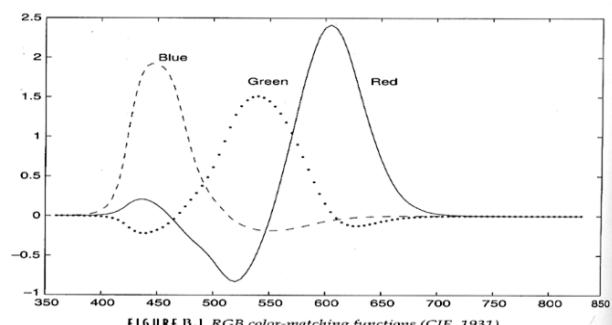
6~7M Cones are the sensors in the eye

3 principal sensing categories in eyes

**Red** light 65%,

**green** light 33%,

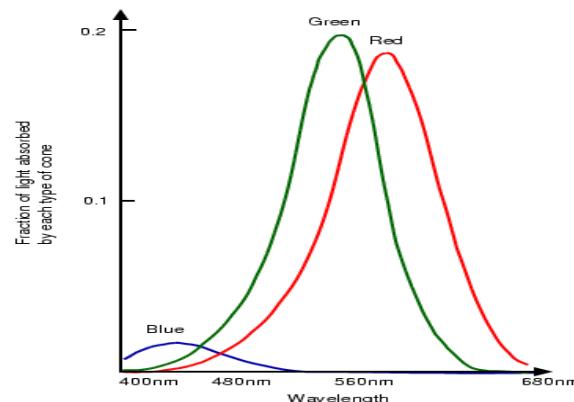
**blue** light 2%



**FIGURE B.1** RGB color-matching functions (CIE, 1931).

## Tristimulus theory of colour perception:

- As discussed in lecture 1, the human retina has 3 kinds of cones.
- The response of each type of cone as a function of the wavelength of the incident light is shown in figure 2.
- The peaks for each curve are at 440nm (blue), 545nm (green) and 580nm (red). Note that the last two actually peak in the yellow part of the spectrum[2].



## Primary and secondary colors

In 1931, CIE(International Commission on Illumination) defines specific wavelength values to the

### Primary colors

$$B = 435.8 \text{ nm} \quad G = 546.1 \text{ nm} \quad R = 700 \text{ nm}$$

However, we know that no single color may be called red, green, or blue

### Secondary colors:

$$G+B=\text{Cyan}, \quad R+G=\text{Yellow} \quad R+B=\text{Magenta}$$

## Primary colors of light v.s. primary colors of pigments

Primary color of pigments: Color that subtracts or absorbs a primary color of light and reflects or transmits the other two

Color of light:  
B

R R G

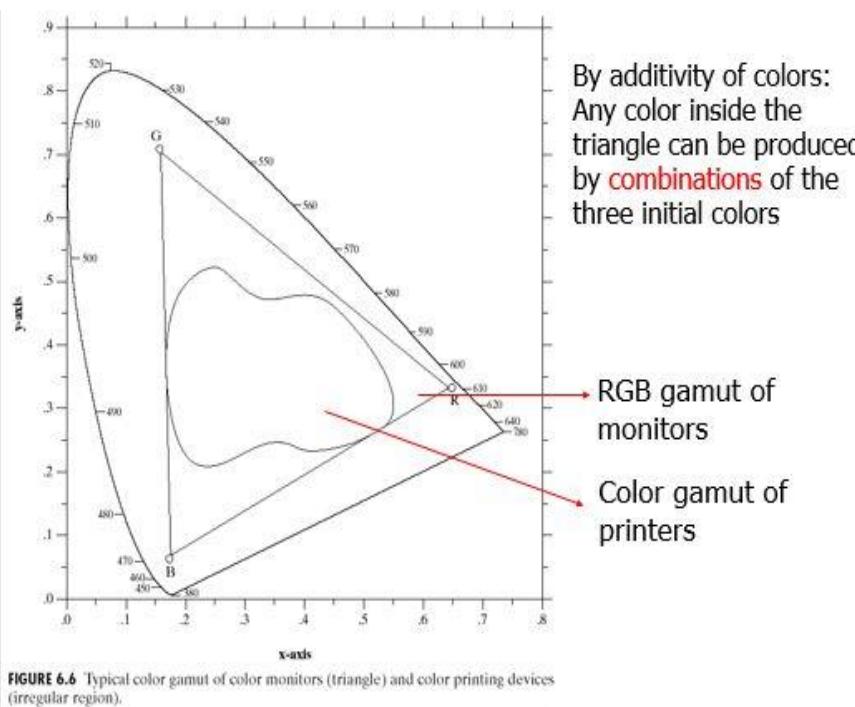
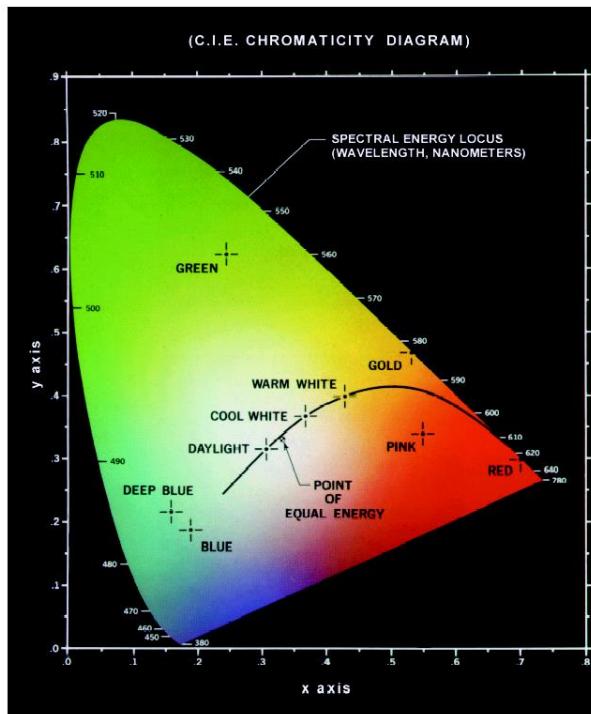
Color of pigments:  
absorb B

absorb R R absorb G

Magenta Yellow Cyan

## CIE primaries

- The tristimulus theory of colour perception seems to imply that any colour can be obtained from a mix of the three primaries, red, green and blue, but although nearly all visible colours can be matched in this way, some cannot.
- However, if one of the primaries is added to one of these unmatchable colours, it can be matched by a mixture of the other two, and so the colour may be considered to have a negative weighting of that particular primary.
- In 1931, the *Commission Internationale de l'Éclairage (CIE)* / (International Commission on Illumination) defined three standard primaries, called  $X$ ,  $Y$  and  $Z$ , that can be added to form all visible colours.
- The primary  $Y$  was chosen so that its colour matching function exactly matches the luminous-efficiency function for the human eye, given by the sum of the three curves in figure



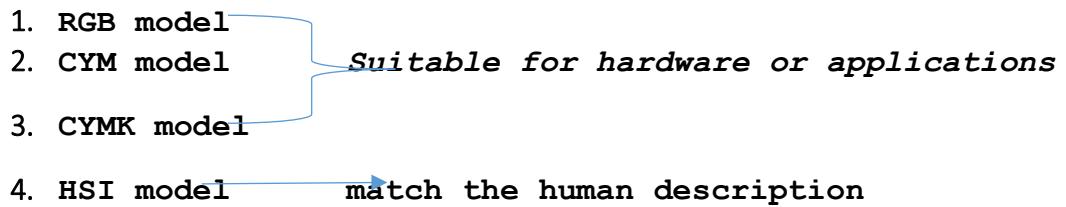
**FIGURE 6.6** Typical color gamut of color monitors (triangle) and color printing devices (irregular region).

## B. Color models

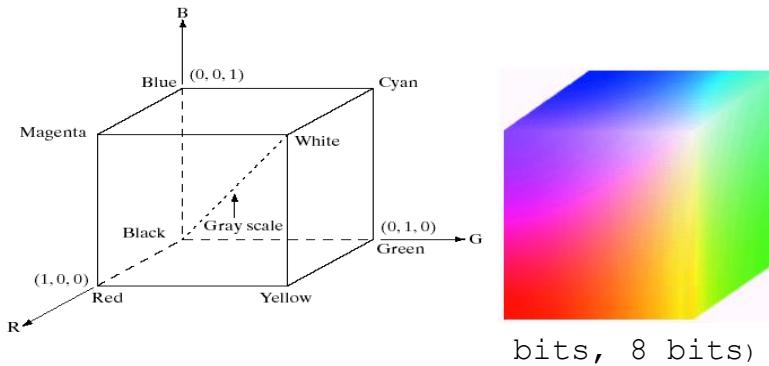
### Color Models

- Color model, color space, color system
- Specify colors in a standard way
- A coordinate system that each color is represented by a single point
  - Colour models provide a standard way to specify a particular colour, by defining a 3D coordinate system, and a subspace that contains all constructible colours within a particular model.

- Any colour that can be specified using a model will correspond to a single point within the subspace it defines.
- Each colour model is oriented towards either specific hardware (RGB, CMY, YIQ), or image processing applications (HSI).



## B.1 RGB color model



Pixel depth: the number of bits used to represent each pixel in RGB space

Full-color image: 24-bit RGB color image

$(R, G, B) = (8 \text{ bits}, 8$

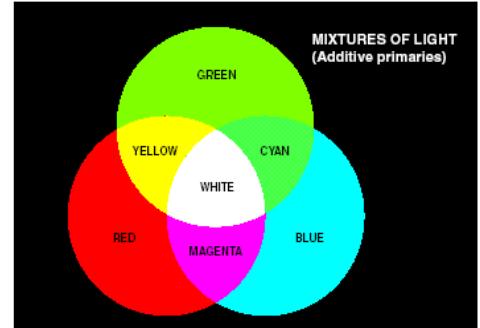
- In the RGB model, an image consists of three independent image planes, one in each of the primary colors: red, green and blue.
- (The standard wavelengths for the three primaries are as shown in above figure. Specifying a particular color is by specifying the amount of each of the primary components present.
- It shows geometry of the RGB color model for specifying colors using a Cartesian coordinate system.
- The greyscale spectrum, i.e. those colors made from equal amounts of each primary, lies on the line joining the black and white vertices.
- This is an *additive* model, i.e. the colors present in the light add to form new colors, and is appropriate for the mixing of colored light for example. The image on the left of figure shows the additive mixing of red, green and blue primaries to form the three secondary colors yellow (red + green), cyan (blue + green) and magenta (red + blue), and white ((red + green + blue)).
- The RGB model is used for color monitors and most video cameras.

## B.2 CMY model (+Black = CMYK)

CMY: secondary colors of light, or primary colors of pigments

Used to generate hardcopy output

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



- The CMY (cyan-magenta-yellow) model is a *subtractive* model appropriate to absorption of colours, for example due to pigments in paints.
- Whereas the RGB model asks what is added to black to get a particular colour, the CMY model asks what is subtracted from white. In this case, the primaries are cyan, magenta and yellow, with red, green and blue as secondary colours .
- When a surface coated with cyan pigment is illuminated by white light, no red light is reflected, and similarly for magenta and green, and yellow and blue. The relationship between the RGB and CMY models is given above:

### Example : Why does blue paint plus yellow paint give green?

- As all schoolchildren know, the way to make green paint is to mix blue paint with yellow. But how does this work?
- If blue paint absorbs all but blue light, and yellow absorbs blue only, when combined no light should be reflected and black paint result.
- However, what actually happens is that imperfections in the paint are exploited. In practice, blue paint reflects not only blue, but also some green. Since the yellow paint also reflects green (since yellow = green + red), some green is reflected by both pigments, and all other colours are absorbed, resulting in green paint.

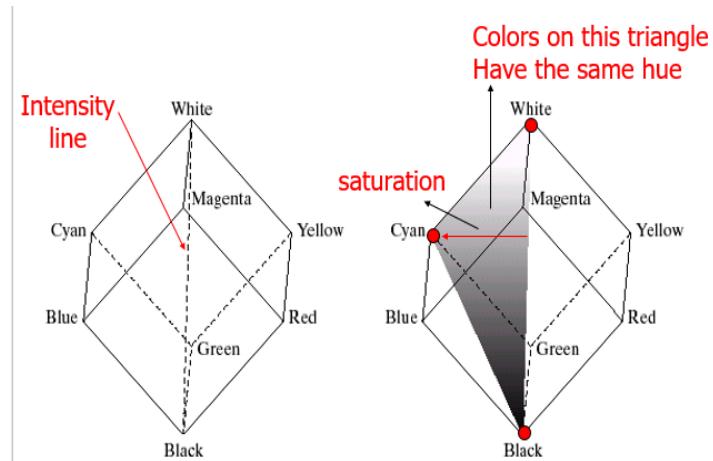
### B.3 HSI color model

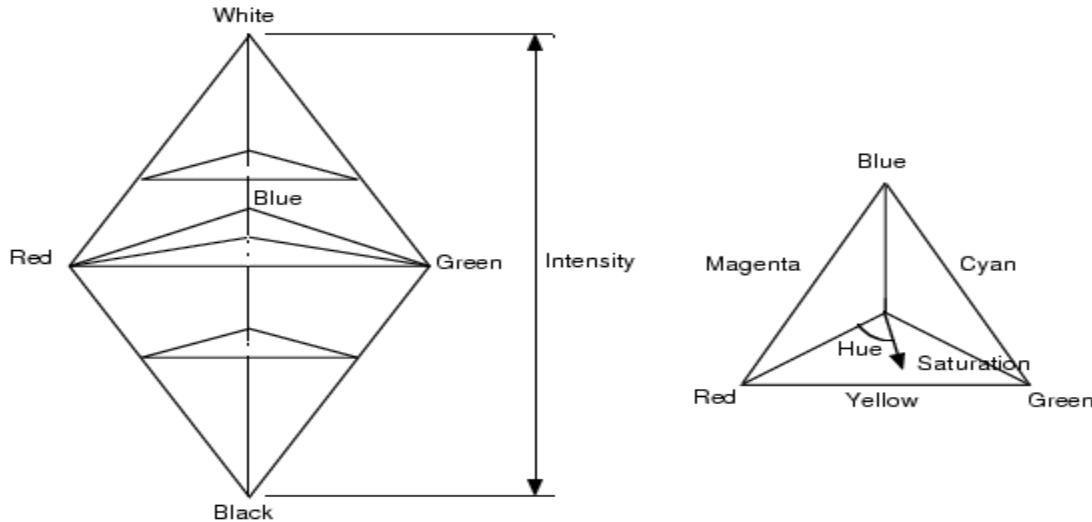
- Will you describe a color using its R, G, B components?
- Human describe a color by its hue, saturation, and brightness

**Hue:** color attribute

**Saturation:** purity of color  
(white->0, primary color->1)

**Brightness:** achromatic notion of intensity.





- As mentioned above, colour may be specified by the three quantities hue, saturation and intensity. This is the HSI model, and the entire space of colours that may be specified in this way is shown in figure
- The HSI model, showing the HSI solid on the left, and the HSI triangle on the right, formed by taking a horizontal slice through the HSI solid at a particular intensity.
- Hue is measured from red, and saturation is given by distance from the axis. Colours on the surface of the solid are fully saturated, i.e. pure colours, and the greyscale spectrum is on the axis of the solid. For these colours, hue is undefined.
  
- Conversion between the RGB model and the HSI model is quite complicated. The intensity is given by

$$I = \frac{R+G+B}{3},$$

- where the quantities R, G and B are the amounts of the red, green and blue components, normalised to the range [0,1]. The intensity is therefore just the average of the red, green and blue components.

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

The saturation is given by:

- where the  $\min(R,G,B)$  term is really just indicating the amount of white present. If any of R, G or B are zero, there is no white and we have a pure colour. The expression for the hue, and details of the derivation may be found in reference.

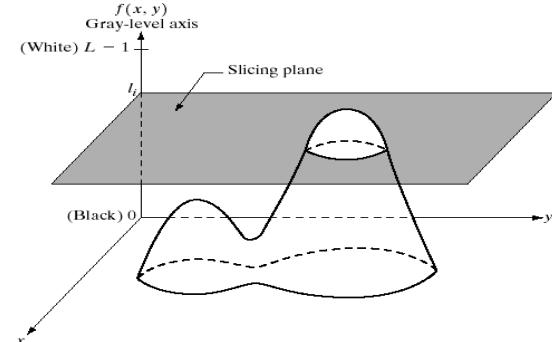
## c. Pseudo-color image processing

### Introduction:

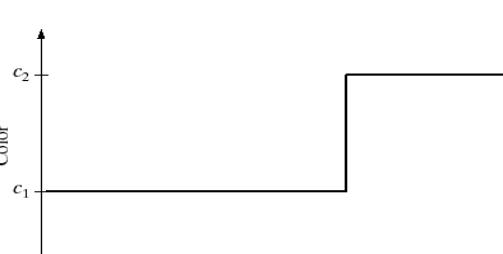
- Assign colors to gray values based on a specified criterion.
- For human visualization and interpretation of gray-scale events.
- Intensity slicing.
- Gray level to color transformations.

### Intensity Slicing:

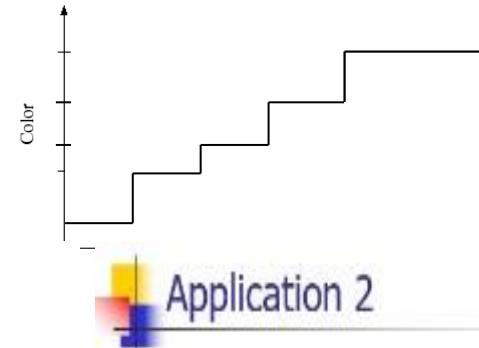
3-D view of intensity image



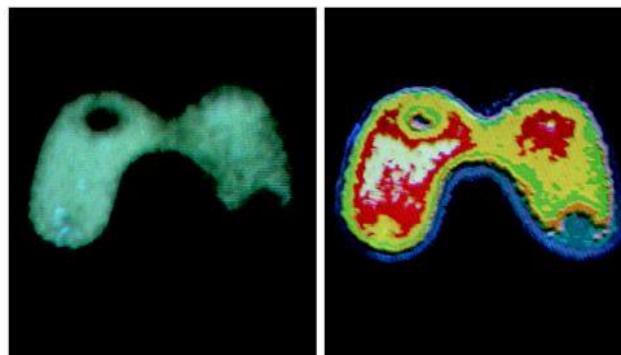
Piecewise Linear transformation of gray level shown below



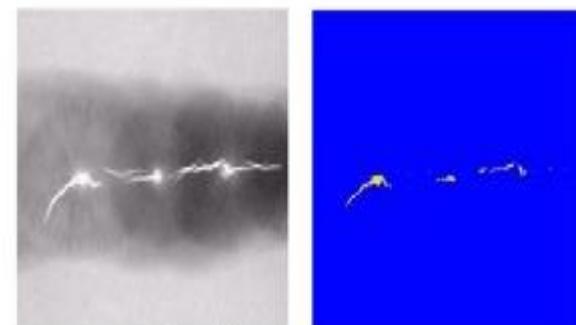
 Application 1



 Application 2



Radiation test pattern → 8 color regions

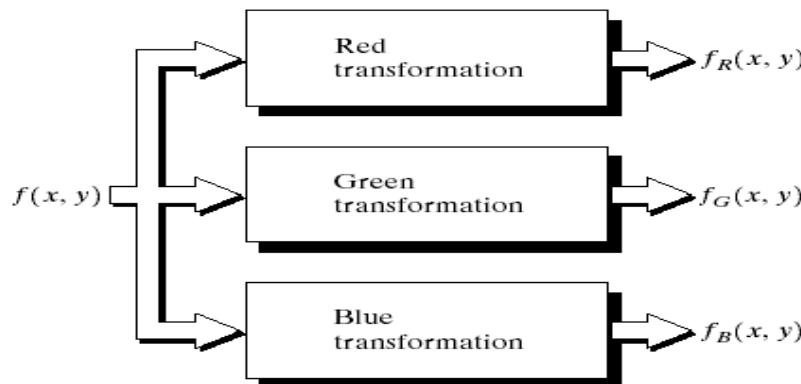


X-ray image of a weld

### Application:

Gray level to color transformation: (to color image)

Assigning colors to gray levels based on specific mappings



**FIGURE 6.23** Functional block diagram for pseudocolor image processing.  $f_R$ ,  $f_G$ , and  $f_B$  are fed into the corresponding red, green, and blue inputs of an RGB color monitor.

functions.

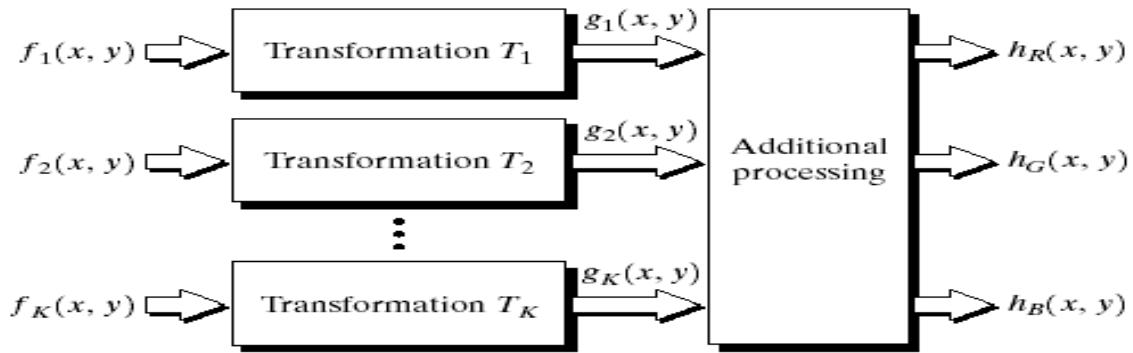
- Given all these different representations of colour, and hence colour images, the question arises as to what is the best way to apply the image processing techniques we have covered so far to these images?
  - One possibility is to apply the transformations to each colour plane in an RGB image, but what exactly does this mean? If we want to increase the contrast in a dark image by histogram equalisation, can we just equalise each colour independently? This will result in quite different colours in our transformed image.
  - In general it is better to apply the transformation to just the intensity component of an HSI image, or the luminance component of a YIQ image, thus leaving the chromaticity unaltered.



- An example is shown in figure above . When histogram equalisation is applied to each colour plane of the RGB image, the final image is lighter, but also quite differently coloured to the original.
  - When histogram equalisation is only applied to the luminance component of the image in YIQ format, the result is more like a lighter version of the original image, as required.

Combine several monochrome images:

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

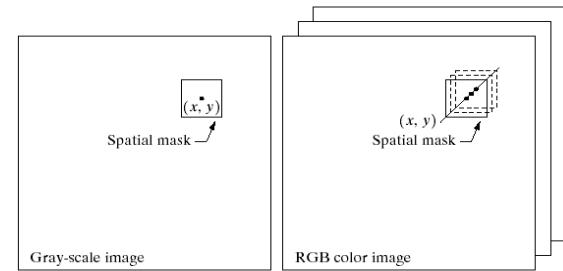


## d. Color transformations

A pixel at  $(x, y)$  is a vector in the color space

$$\text{RGB color space } \mathbf{c}(x, y) = \begin{bmatrix} R(x, y) \\ G(x, y) \\ B(x, y) \end{bmatrix}$$

c.f. gray-scale image  
 $f(x, y) = I(x, y)$



**Color vector:**

**Per-color-component processing:** Process each color component

**Vector-based processing:** Process the color vector of each pixel

*Example: of Per-color-component processing is smoothing an image by smoothing each RGB component separately.*

**When can the above methods be equivalent?**

Process can be applied to both scalars and vectors

Operation on each component of a vector must be independent of the other component.

**Example of Full Color Image with various Color space components:**

In color transformation, it's used to transform color to color.

Formulation:  $\mathbf{g}(\mathbf{x}, \mathbf{y}) = \mathbf{T}[\mathbf{f}(\mathbf{x}, \mathbf{y})]$

Where,  $\mathbf{f}(\mathbf{x}, \mathbf{y})$  = input color image,  
 $\mathbf{g}(\mathbf{x}, \mathbf{y})$  = output color image

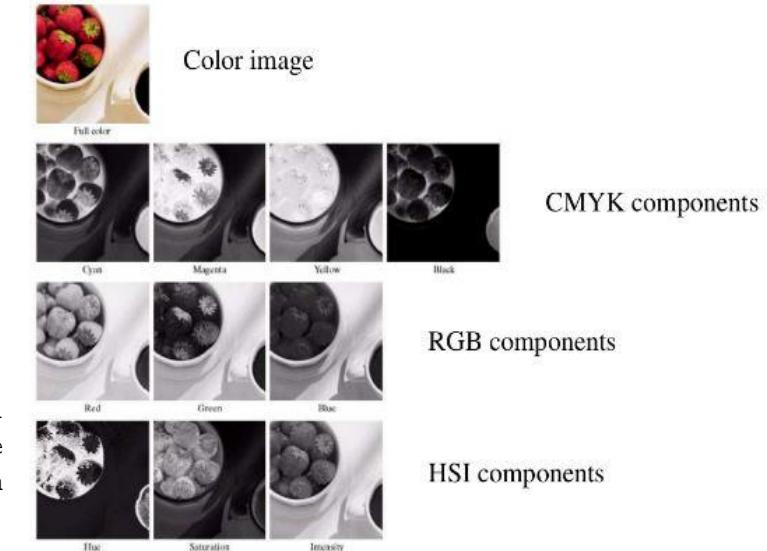
$\mathbf{T}$  = operation on  $f$  over a spatial neighborhood of  $\mathbf{f}(\mathbf{x}, \mathbf{y})$ .

When only data at one pixel is used in the transformation, we can express the transformation as:

$$\mathbf{s}_i = \mathbf{T}_i (\mathbf{r}_1, \mathbf{r}_2, \mathbf{K}, \mathbf{r}_n) \quad i=1, 2, 3, \dots, n$$

where  $\mathbf{r}_i$  = color component of  $\mathbf{f}(\mathbf{x}, \mathbf{y})$

For RGB image  $n=3$



### Example: Color Transformation

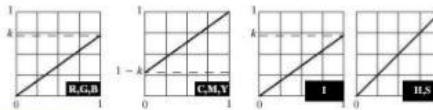
Formula for RGB:

$$\begin{aligned}s_R(x, y) &= k r_R(x, y) \\s_G(x, y) &= k r_G(x, y) \\s_B(x, y) &= k r_B(x, y)\end{aligned}$$



Formula for HSI:

$$s_I(x, y) = k r_I(x, y)$$



Formula for CMY:

$$\begin{aligned}s_C(x, y) &= k r_C(x, y) + (1-k) \\s_M(x, y) &= k r_M(x, y) + (1-k) \\s_Y(x, y) &= k r_Y(x, y) + (1-k)\end{aligned}$$

These 3 transformations give the same results.

## e. Smoothing and sharpening

### Smoothing

Color image smoothing image is classified as:

1. Per color plane method
2. Smooth only intensity component

### 1. Per color plane method :

For RGB, CMY color models Smooth each color plane using moving averaging and combine back to RGB.

$$\bar{\mathbf{c}}(x, y) = \frac{1}{K} \sum_{(x,y) \in S_{xy}} \mathbf{c}(x, y)$$

↑                          ↓  
Neighborhood  
Centered at (x,y)

$$\bar{\mathbf{c}}(x, y) = \begin{bmatrix} \frac{1}{K} \sum_{(x,y) \in S_{xy}} R(x, y) \\ \frac{1}{K} \sum_{(x,y) \in S_{xy}} G(x, y) \\ \frac{1}{K} \sum_{(x,y) \in S_{xy}} B(x, y) \end{bmatrix}$$

vector processing

per-component processing

### 2. Smooth only intensity component

In HIS image while leaving H and S unmodified.

**Example**

Color image



Red

Green



Blue



(Images from Rafael C. Gonzalez and

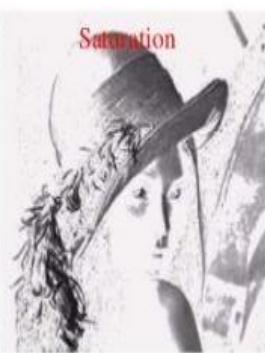


Color image

HSI Components



Hue



Saturation



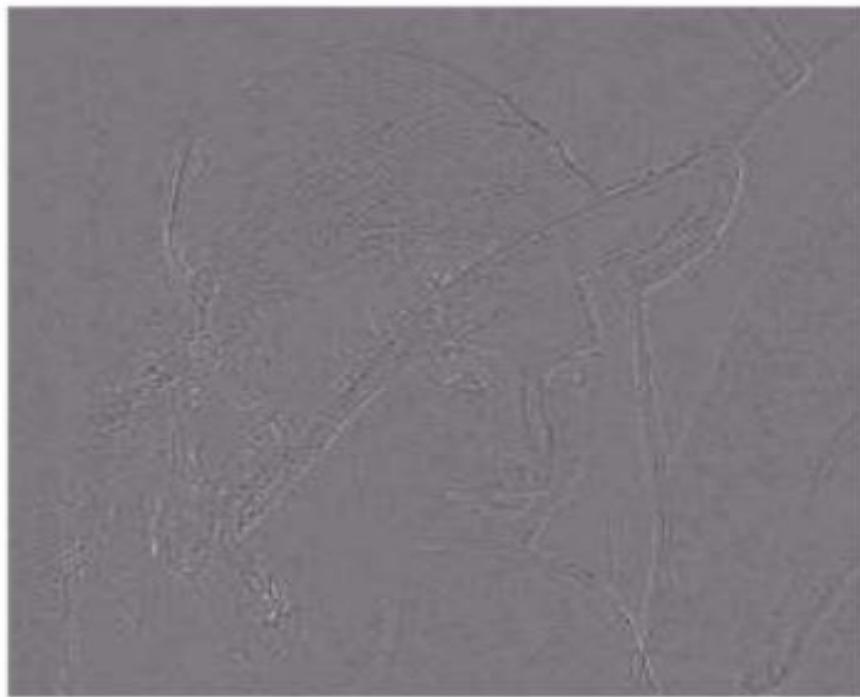
Intensity



Smooth all RGB components

Smooth only I component of HSI

(faster)



**Difference between smoothed results from 2 methods in the previous slide.**

## Sharpening:

Image Sharpening can be done same manner as color image smoothing:

1. Per-color-plane method for RGB, CMY images
2. Sharpening only, I component of a HSI image



Sharpening all RGB components



Sharpening only I component of HSI



Difference between  
sharpened results from 2  
methods in the previous  
slide.