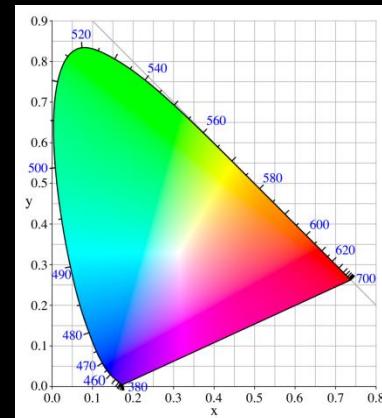


# CS4495/6495

## Introduction to Computer Vision

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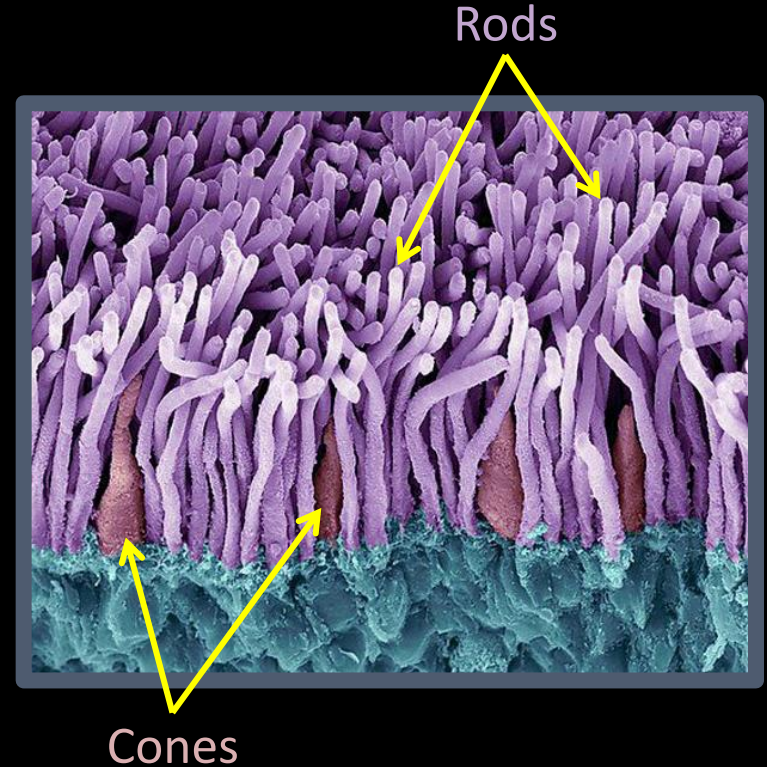
### 9A-L1 *Color spaces*



# Light Detection: Rods and Cones

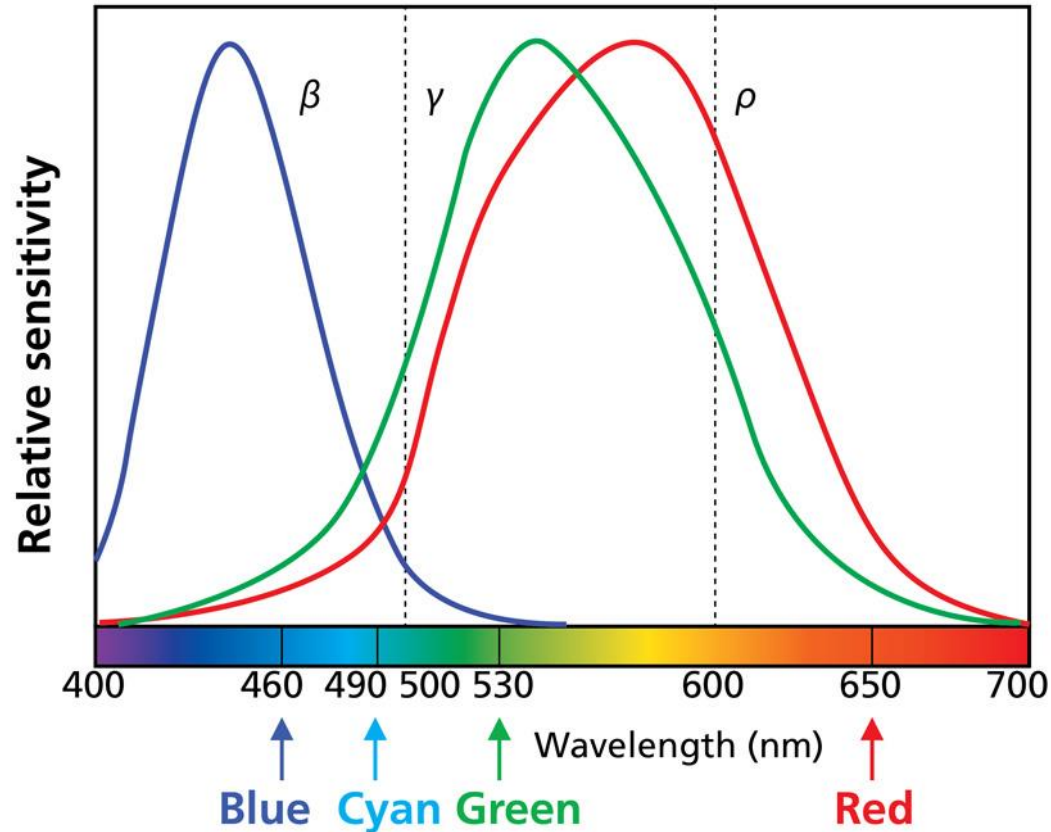
## Cones:

- 6-7 million cones in the retina
- Responsible for high-resolution vision
- Discriminate colors
- Three types of color sensors (64% red, 32% green, 2% blue)

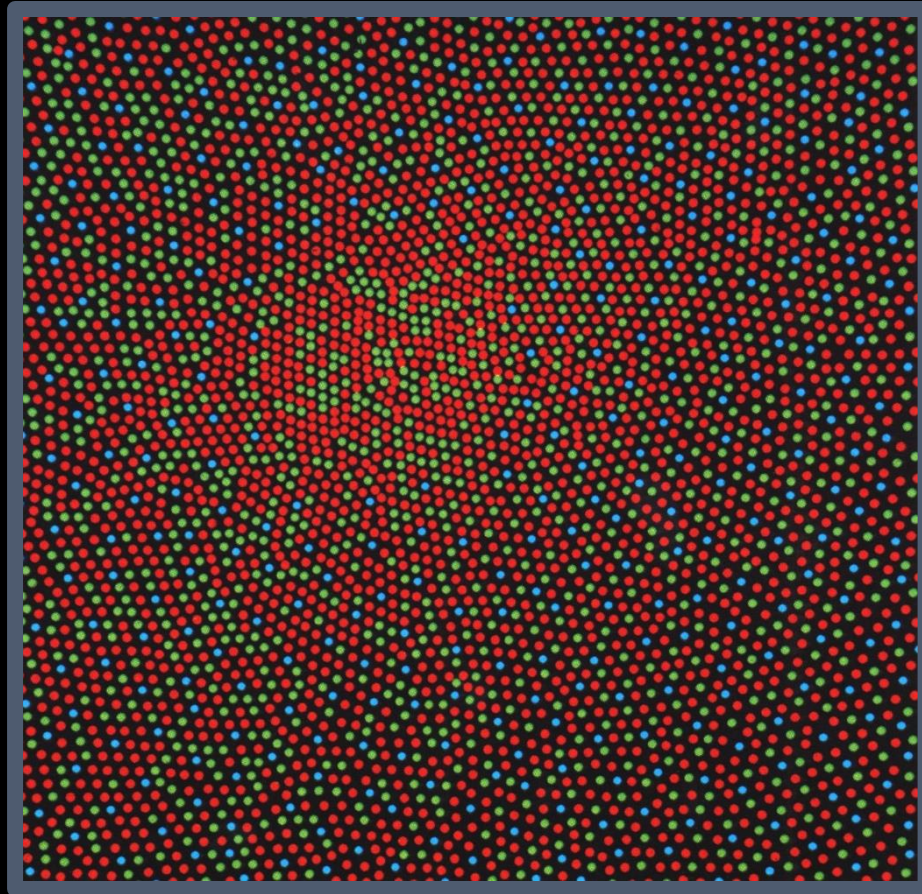


# Human spectral sensitivity to color

Three cone types ( $\rho$ ,  $\gamma$ ,  $\beta$ ) correspond roughly to R, G, B.



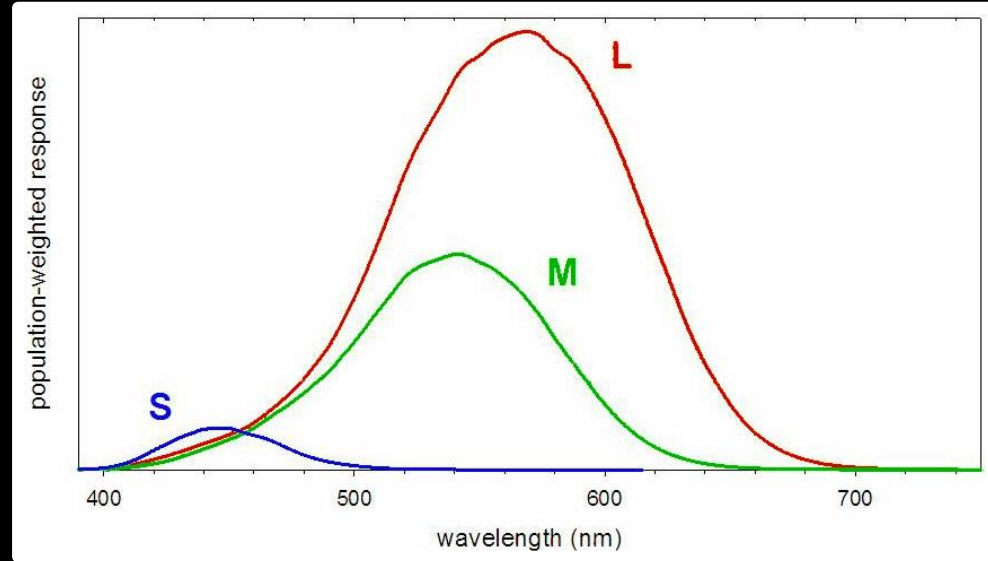
Retina Mosaic



# Tristimulus Color Theory

Spectral-response functions of each of the three types of cones

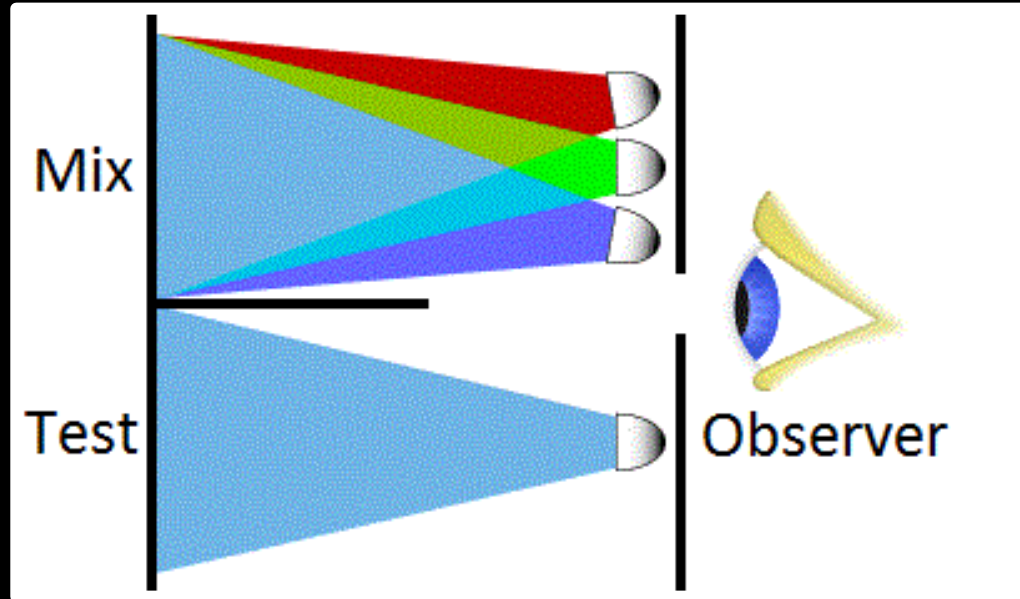
- Can we use them to match any spectral color?



Percentage of light absorbed  
by each cone

# Color matching function based on RGB

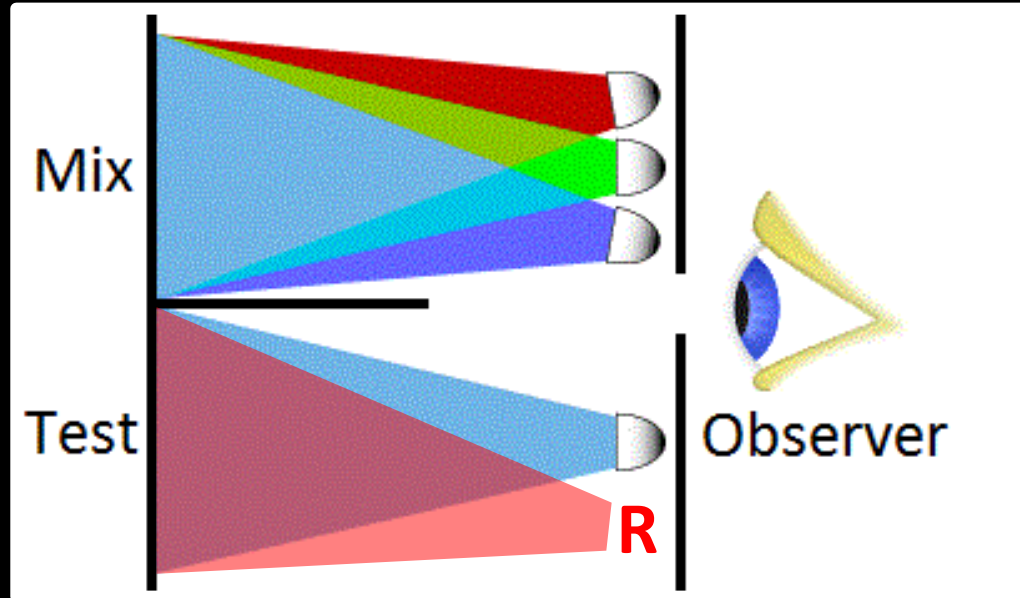
Most spectral color can be represented as a positive linear combination of these primary colors (but...)



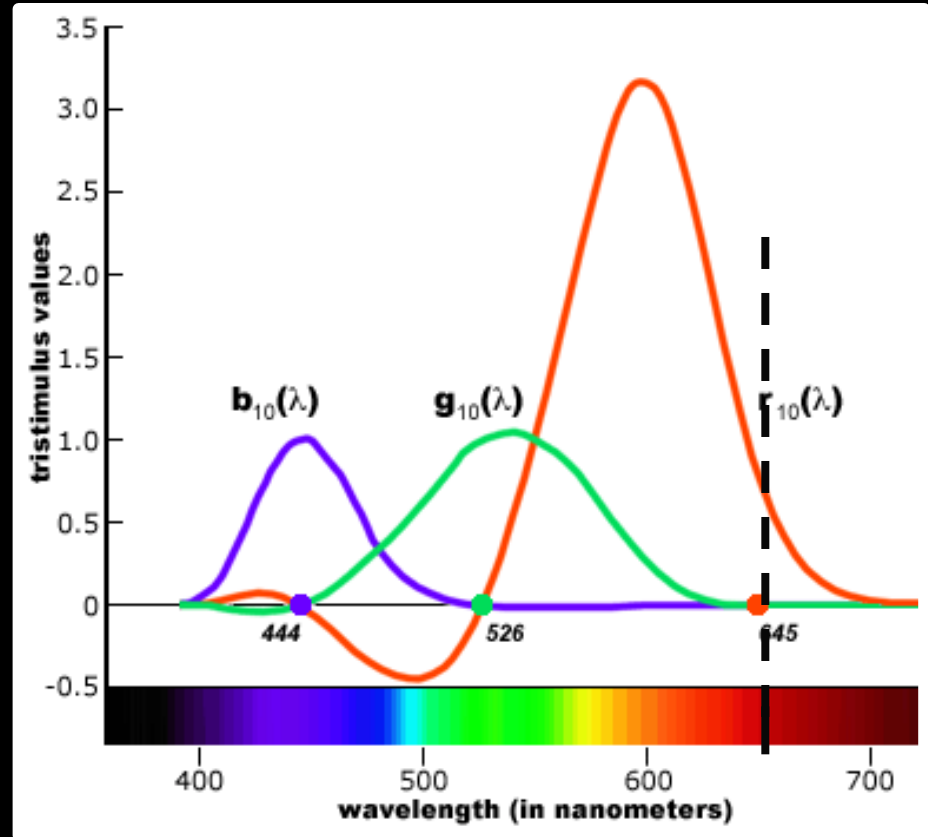
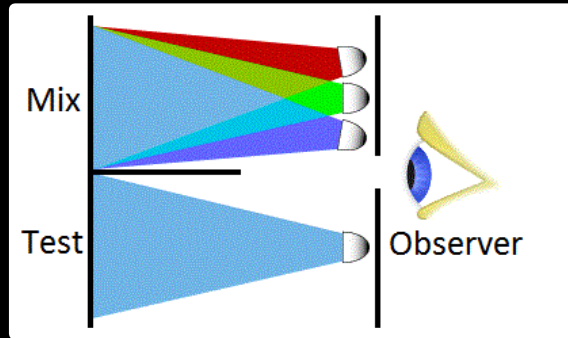


# Color matching function based on RGB

But some spectral cannot – need to add some red



# Color matching function based on RGB





# Luminance vs color

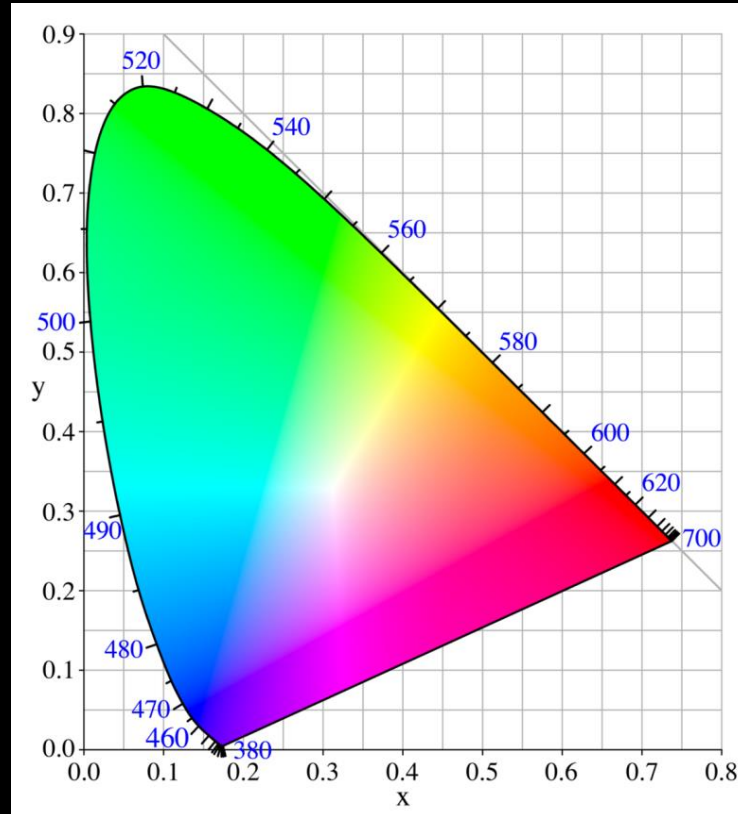


# CIE RGB color space

Color matching experiments [Wright & Guild 1920s]

- Mapped physical wavelengths to perceived colors
- Identified relative similarity and difference between colors
- Result: CIE RGB space defined

# Colors perceivable by the human eye



CIE xy chromaticity  
diagram, 1931

# CIE XYZ color space

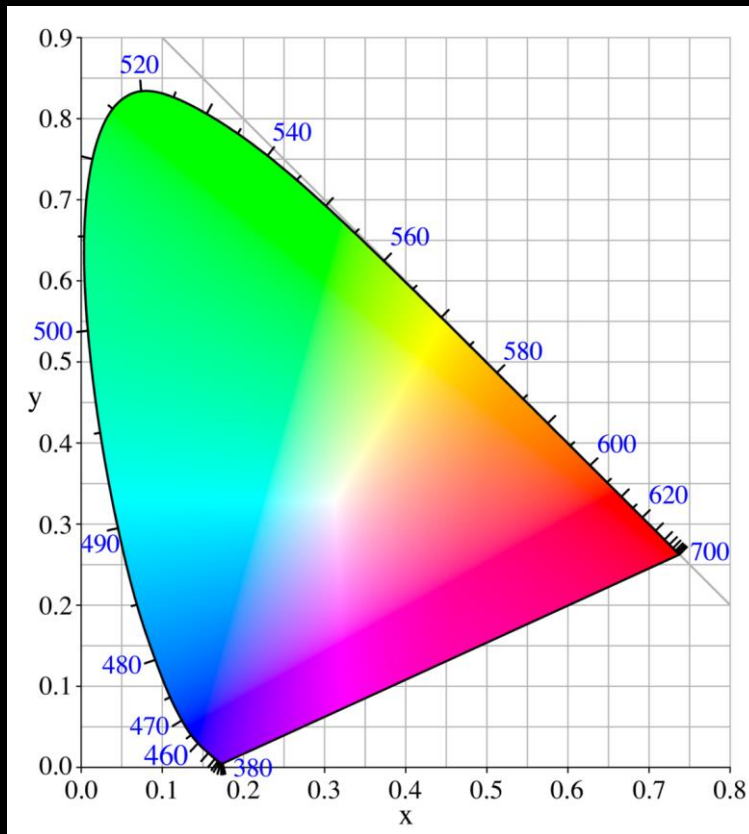
A new space with desired properties

- Easy to compute – linear transform of CIE RGB
- Y: Perceived luminance
- X, Z: Perceived color
- Represents a wide range of colors

# Colors perceivable by the human eye

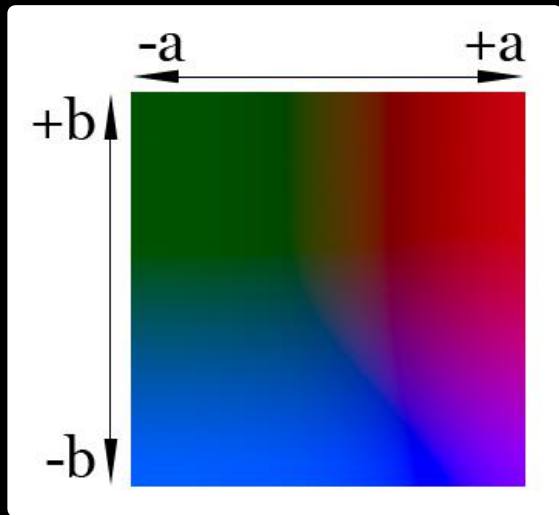
$$x = \frac{X}{X + Y + Z}$$

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

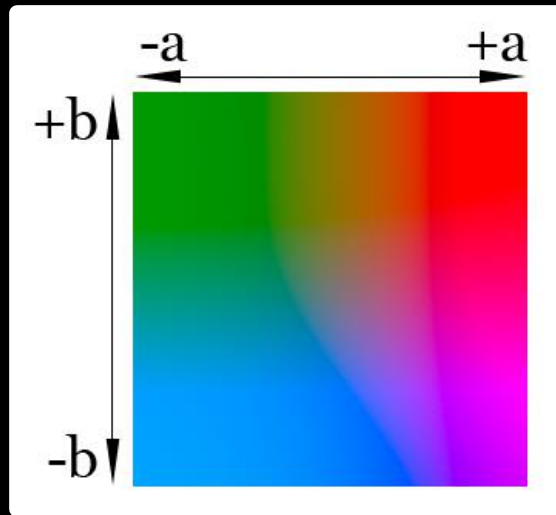


CIE xy chromaticity  
diagram, 1931

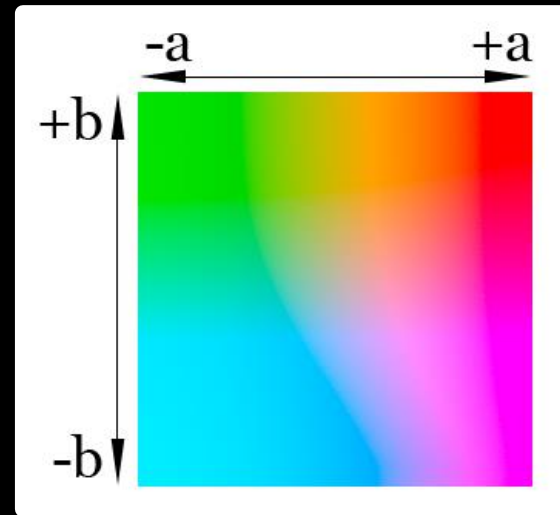
# CIE $L^*a^*b^*$ color space



$L = 25\%$



$L = 50\%$

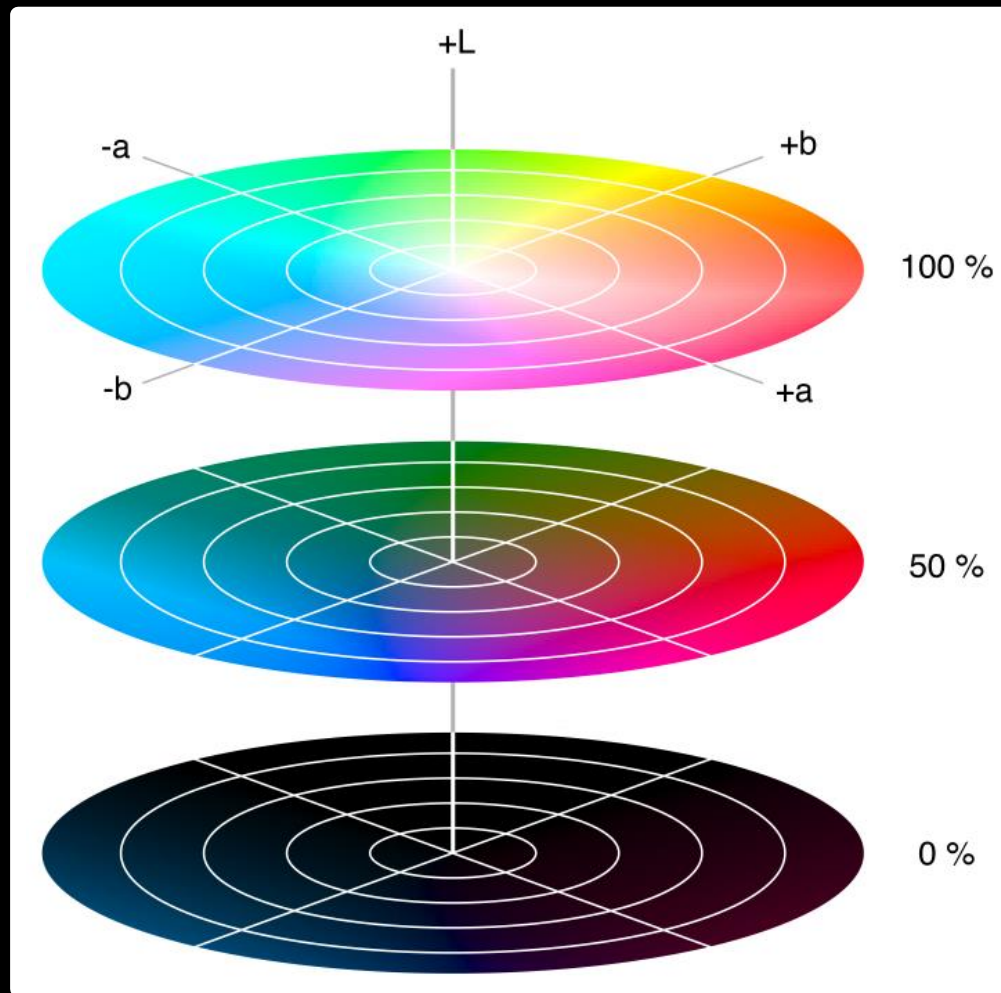


$L = 75\%$

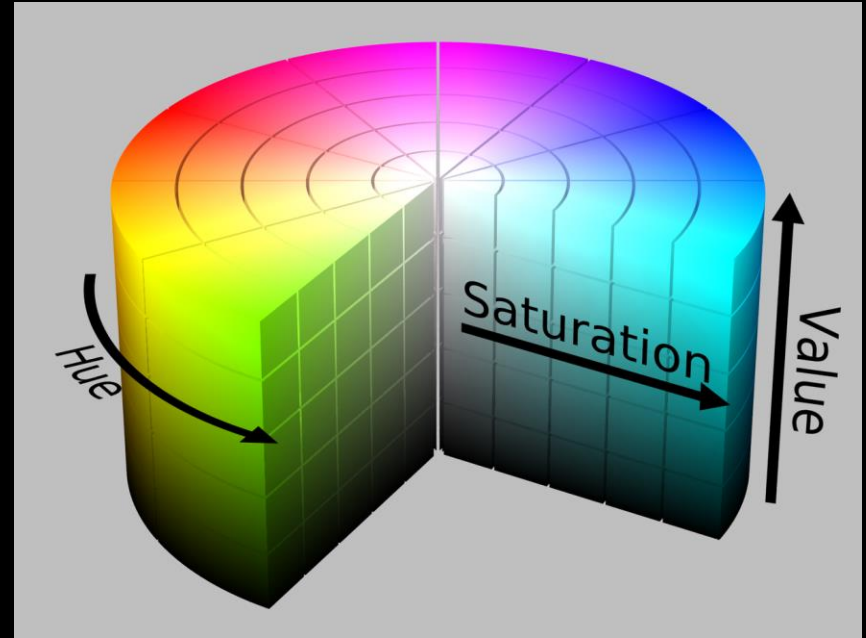
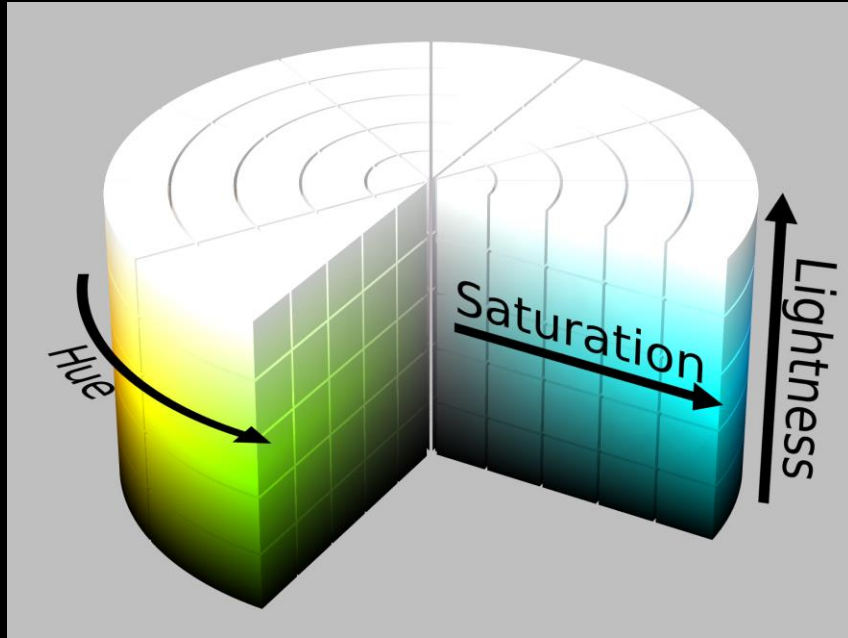


# Cylindrical view

Think of chroma  
(here  $a^*$ ,  $b^*$ ) defining a  
planar disc at each  
luminance level ( $L$ )



# HSL and HSV color spaces



# Quiz: Hue difference

If hue values range in  $[0, 360]$ , what is the absolute difference between the following pairs of hues?

- 225 and 75

- 45 and 315

# Quiz: Hue difference

If hue values range in  $[0, 360]$ , what is the absolute difference between the following pairs of hues?

- 225 and 75

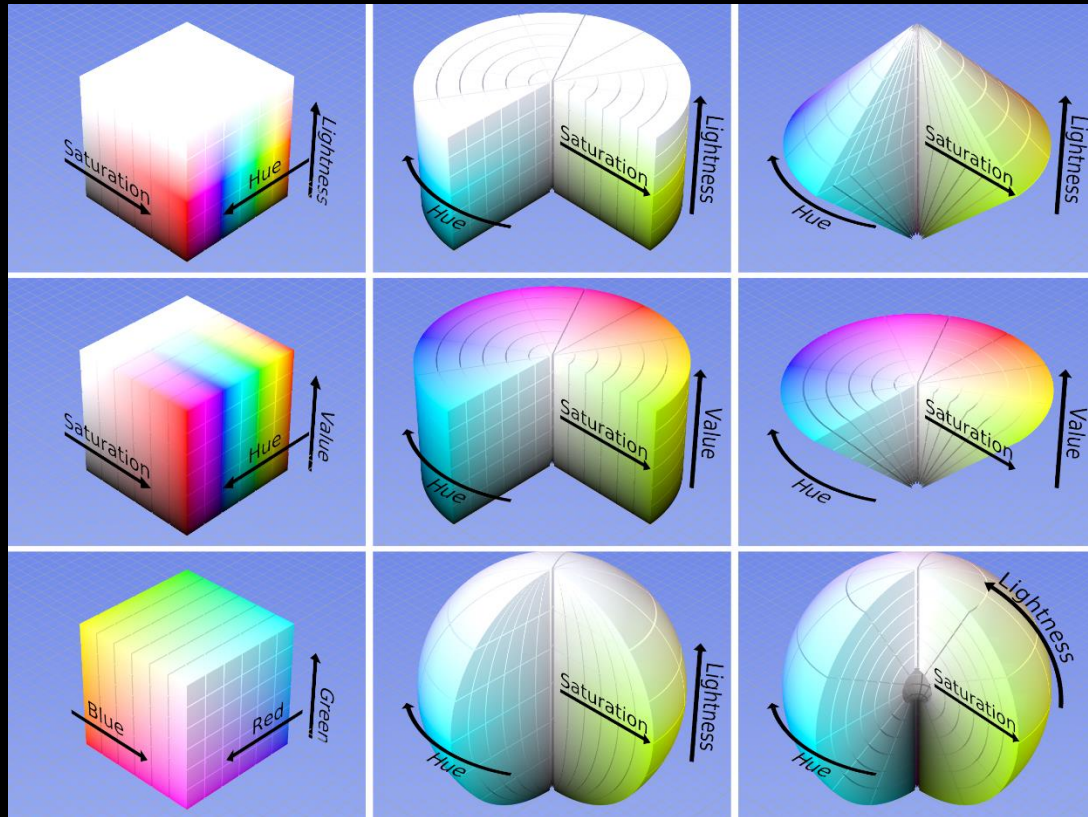
150

- 45 and 315

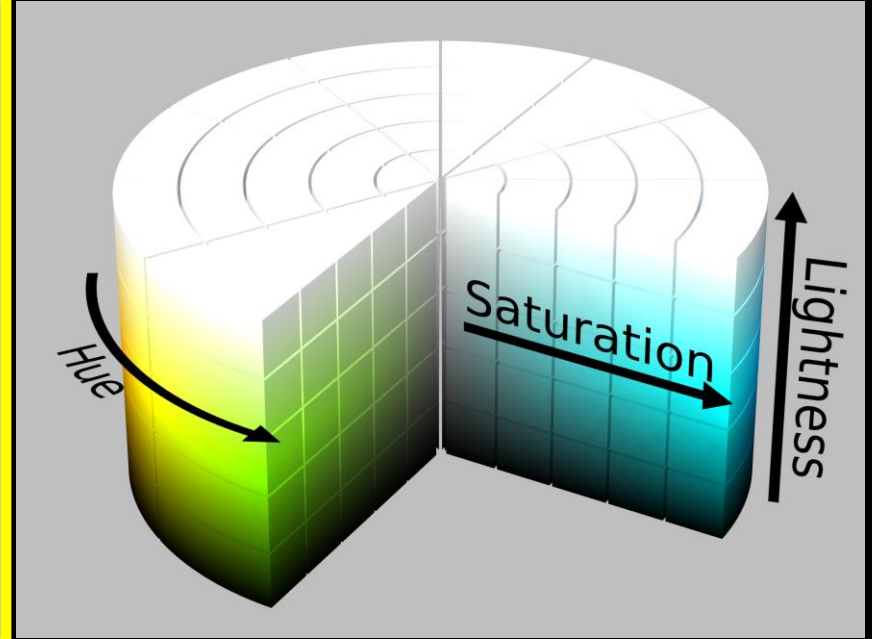
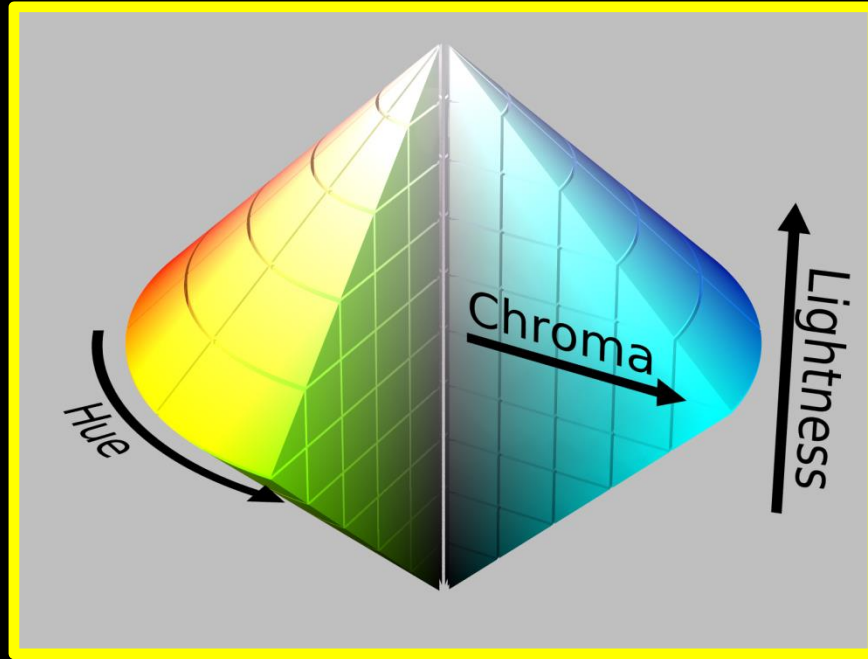
90

*Hue is an angular measure,  
it “wraps around” at 0/360*

# But there are lots of color spaces



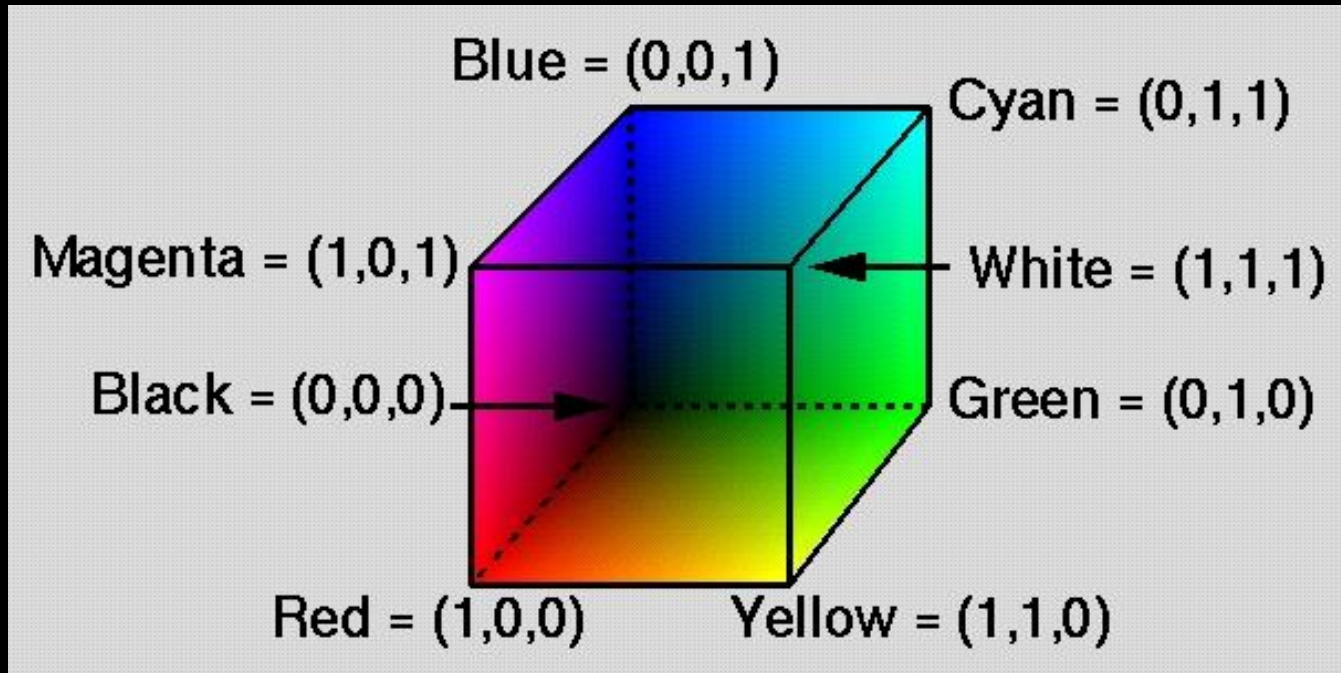
# My favorite



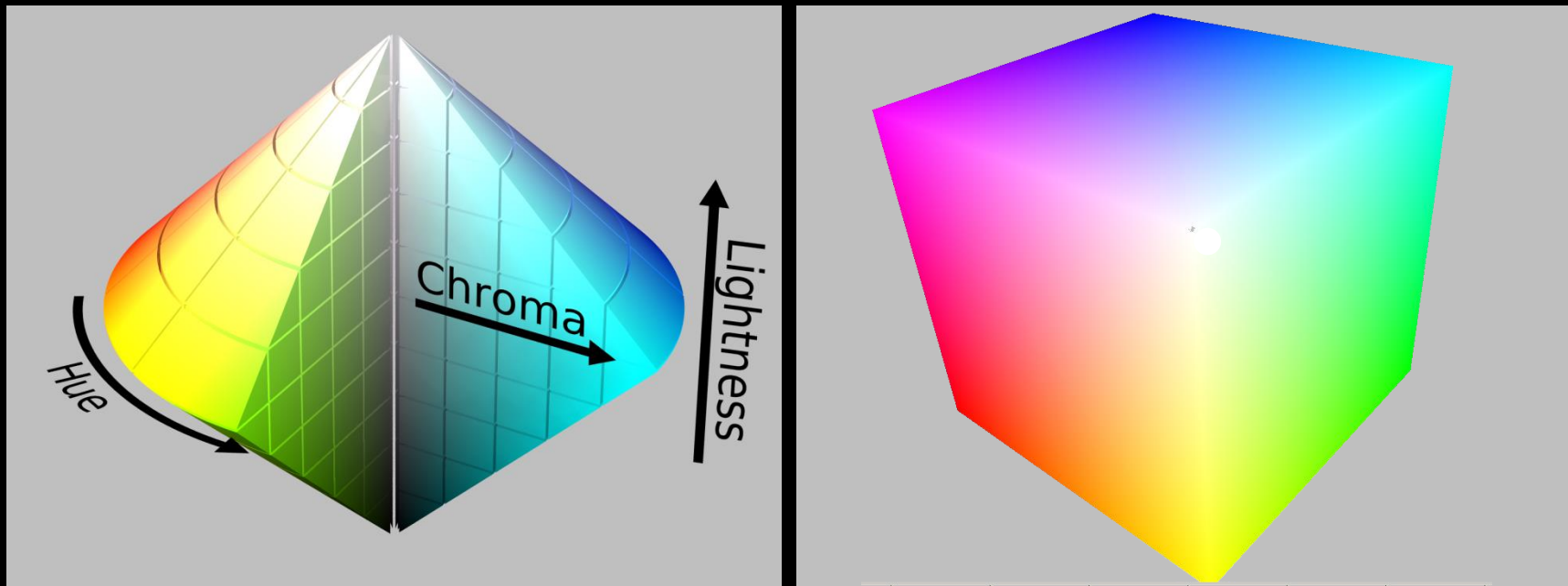


# The one we know best...

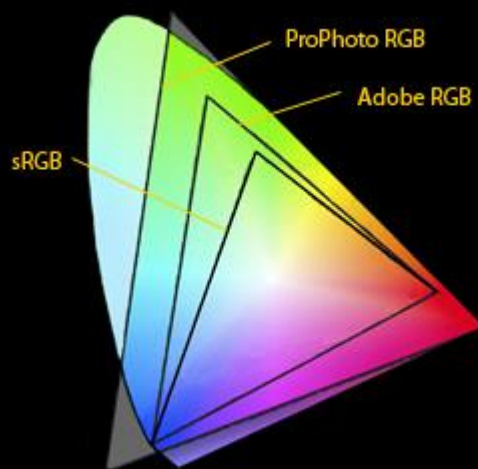
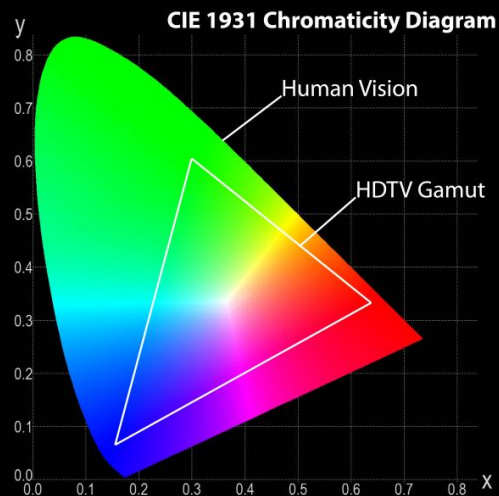
- RGB color space



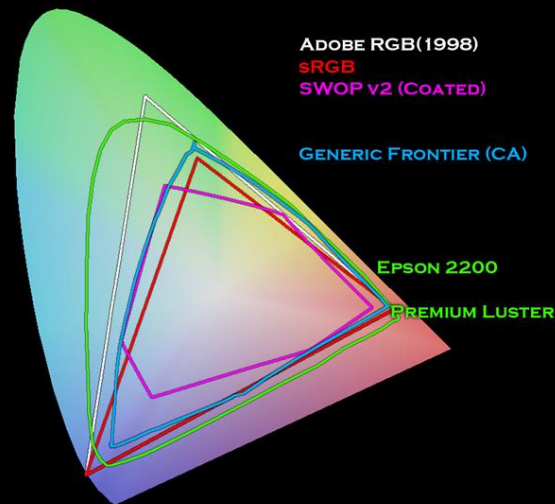
# Like a squared double cone?



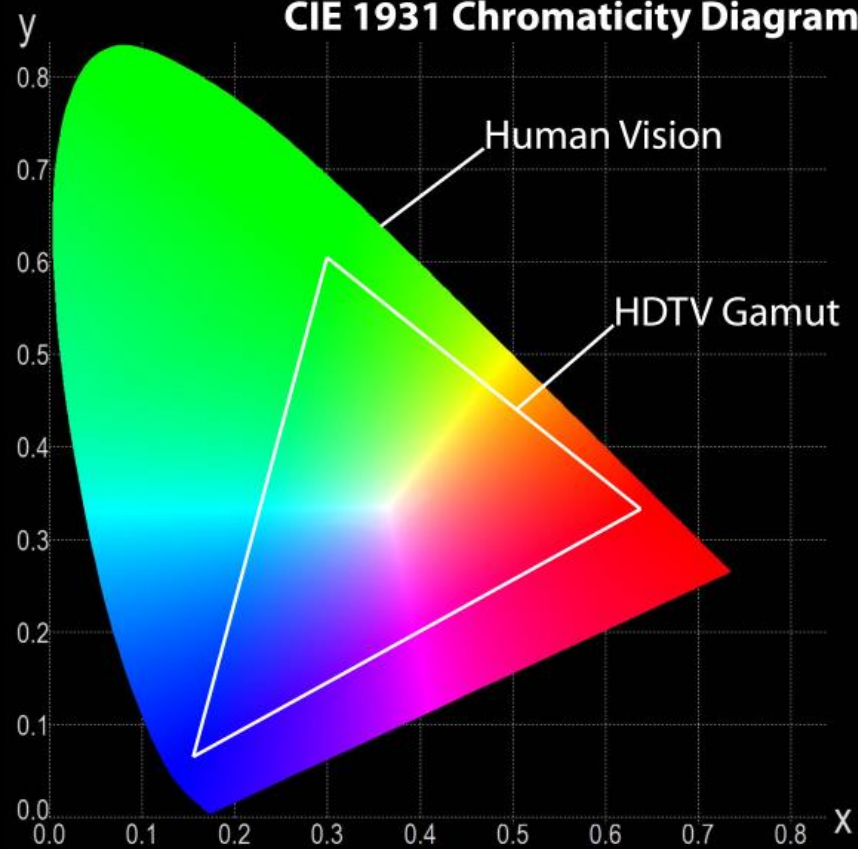
# Color gamuts

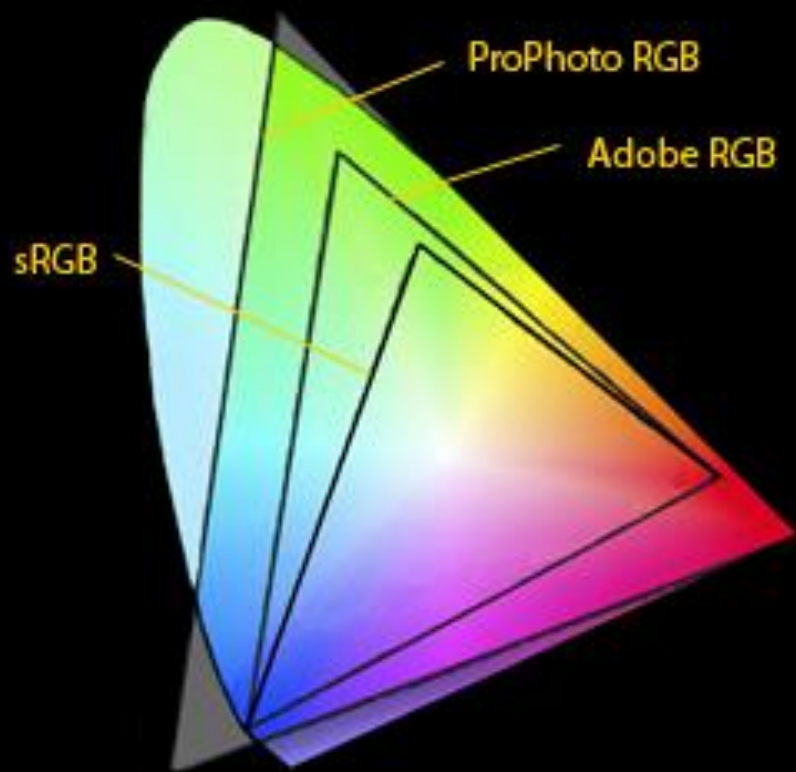


## Some Gamut Comparisons

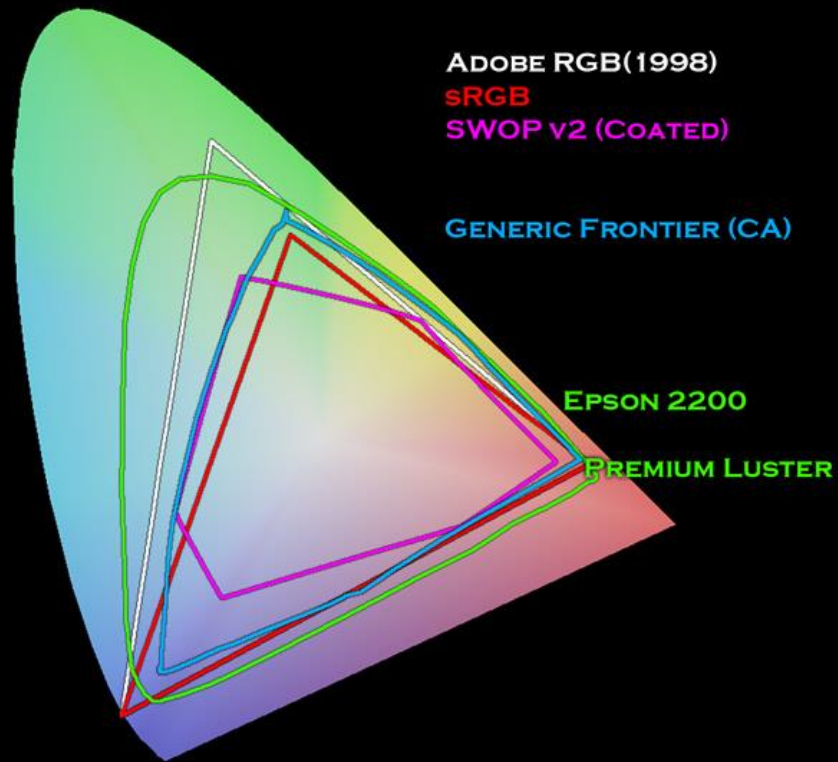


## CIE 1931 Chromaticity Diagram





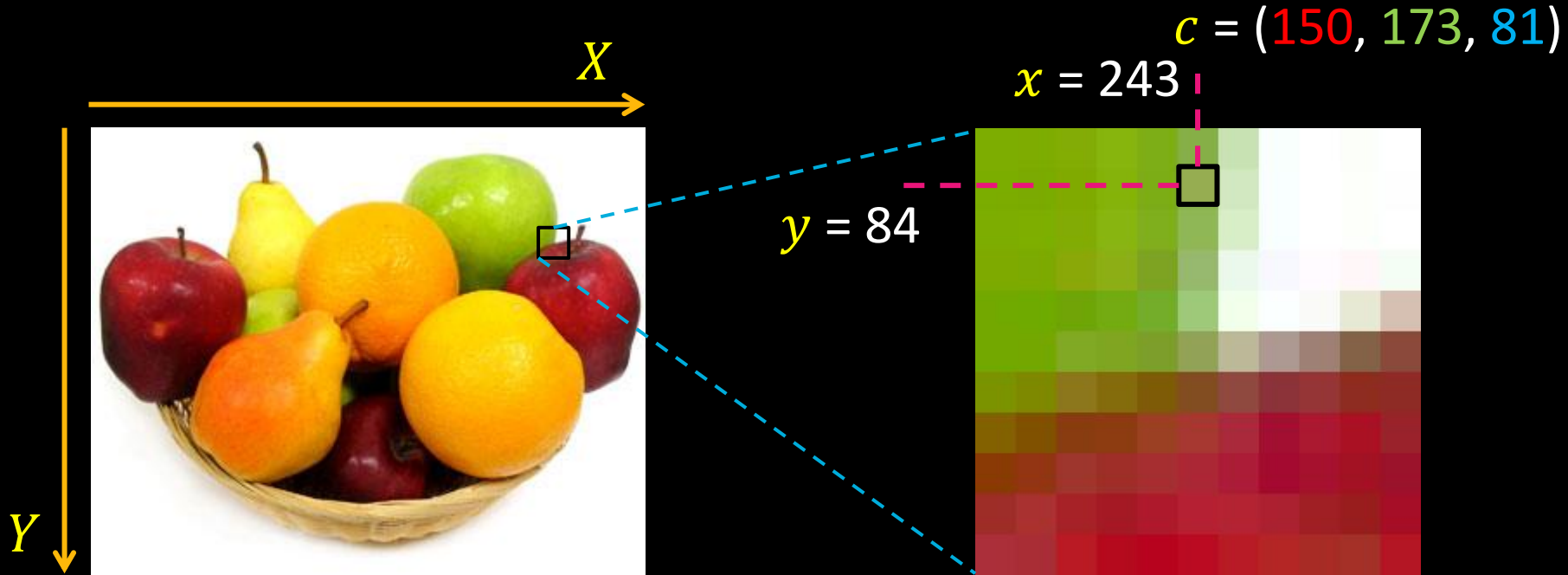
# Some Gamut Comparisons



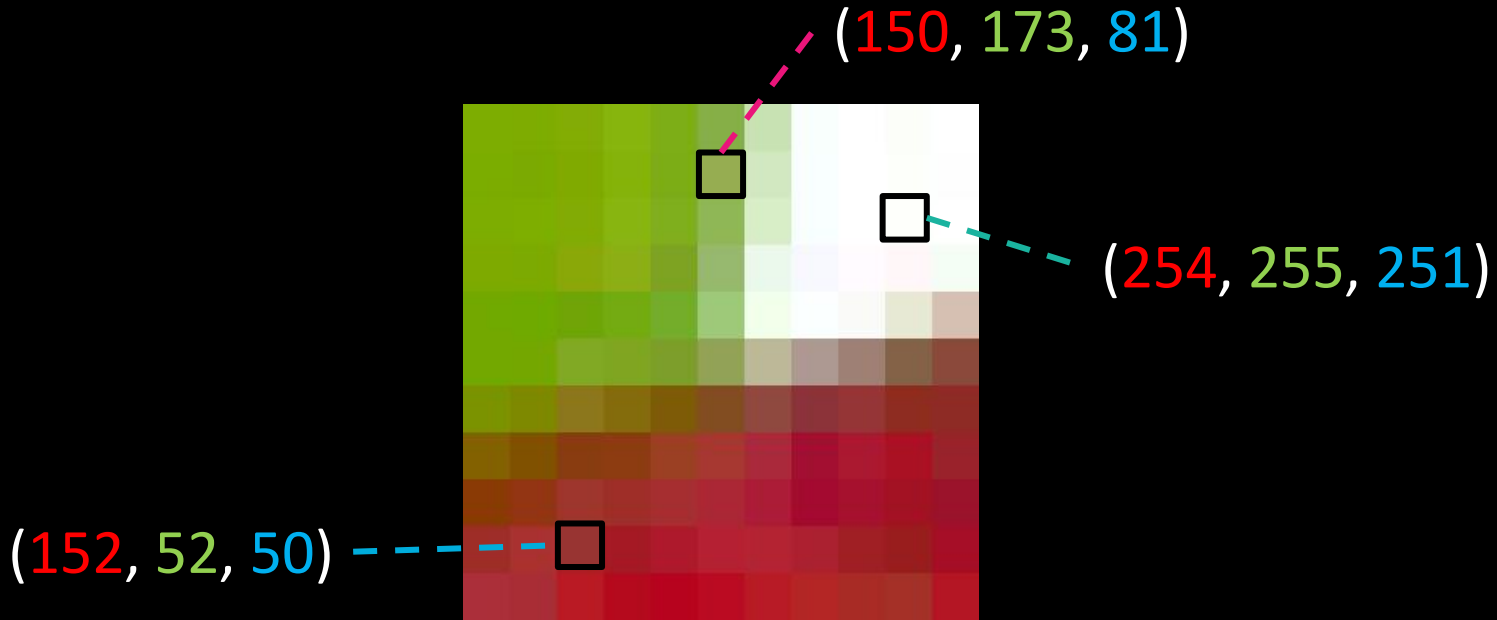


# Revisiting pixels

“Picture element” at location  $(x, y)$ , value or color  $c$



Color values are vectors, here (R, G, B)



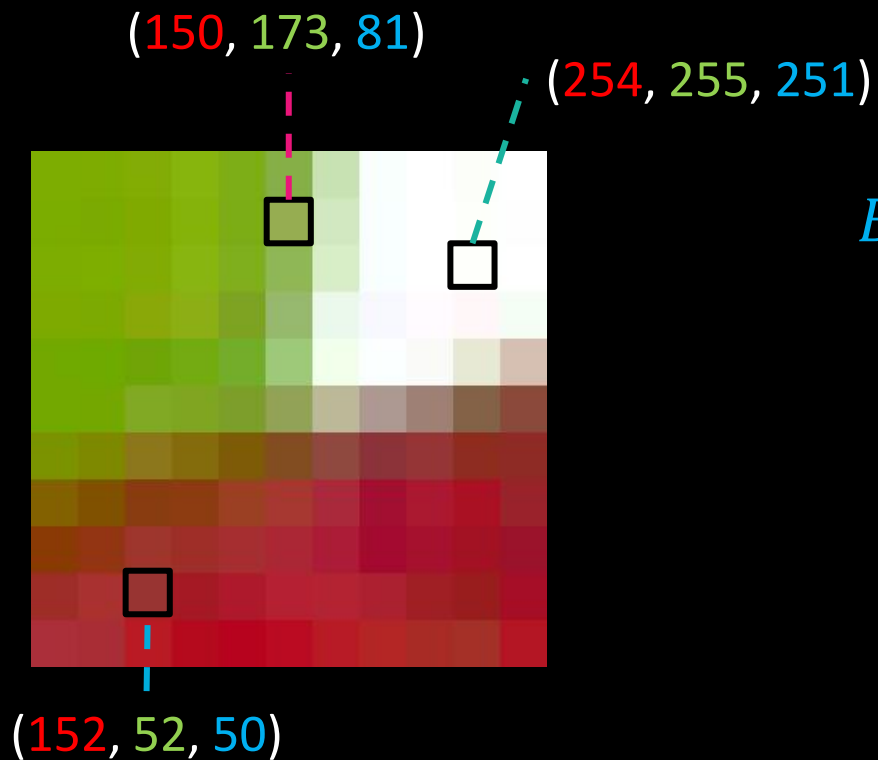
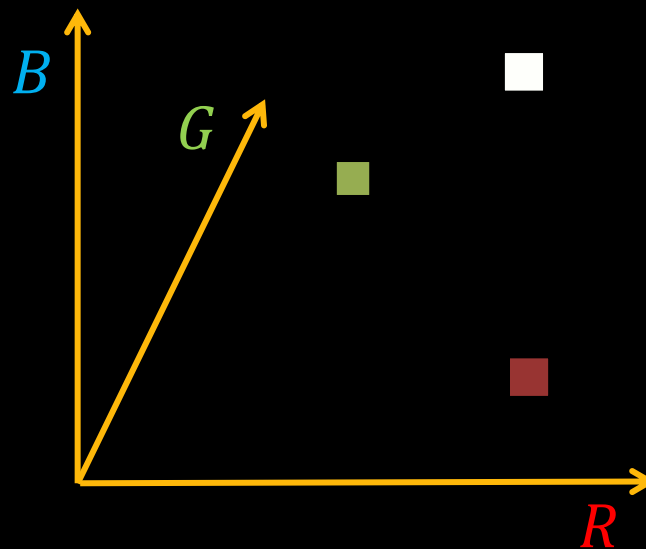


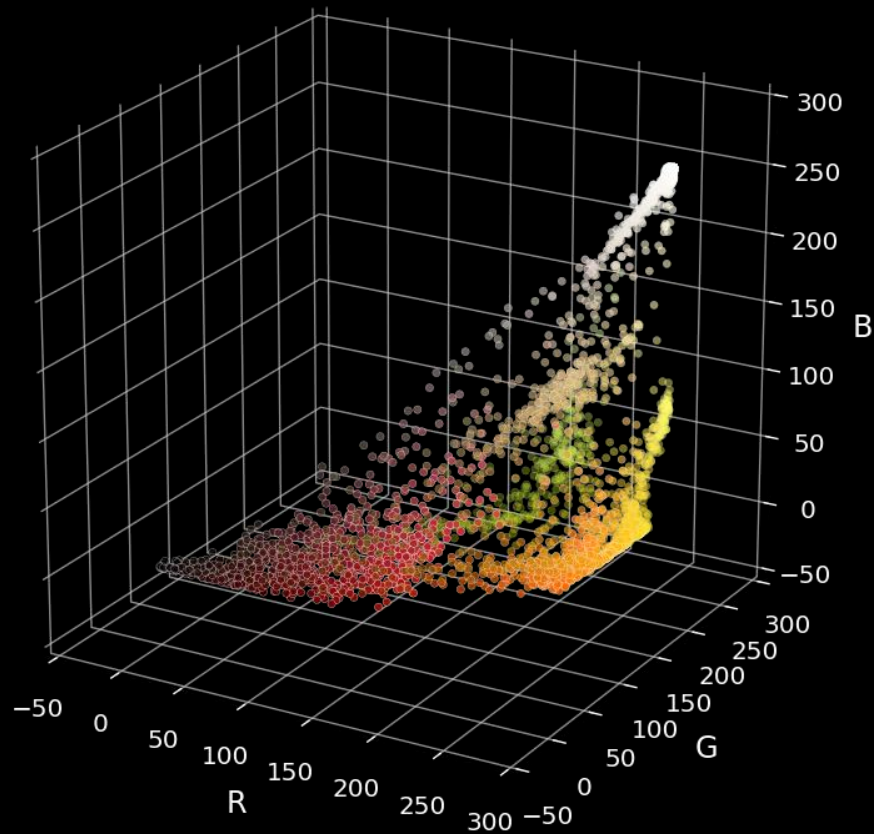
Image Space



RGB Color Space



RGB color distribution



# Quiz: Plotting pixels in a color space

What does this view enable us to do?

- Think about clusters of pixels that are similar in color
- Understand the shape and size of objects present
- Identify pixels that are different, and separate them
- Count how many pixels of each color there are

# Quiz: Plotting pixels in a color space

What does this view enable us to do?

- ☒ Think about clusters of pixels that are similar in color
- ☐ Understand the shape and size of objects present
- ☒ Identify pixels that are different, and separate them
- ☐ Count how many pixels of each color there are



# Example: Red filter



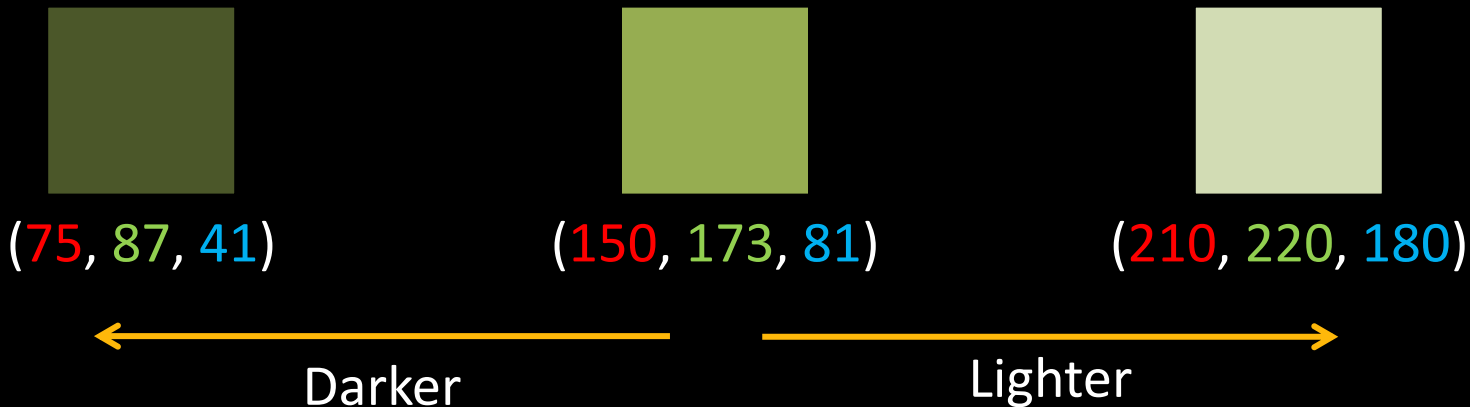
Filter:  $R \in [0,255]$ ,  
 $G \in [0,100]$ ,  
 $B \in [0,100]$

# Example: Red filter – more red!



Filter:  $R \in [0,255]$ ,  
 $G \in [0,50]$ ,  
 $B \in [0,50]$

# How intensity affects color values



Just different shades of green, but all 3 values change!

# Solution: Separate intensity and *color*



Define intensity ( $Y$ ) as some combination of  $R$ ,  $G$ ,  $B$

$$\begin{aligned} Y &= W_R \times R + W_G \times G + W_B \times B \\ &= 0.299 \times R + 0.587 \times G + 0.114 \times B \end{aligned}$$

# Solution: Separate intensity and *color*

Then compute new color values, taking out intensity

$$U = U_{max} \frac{B - Y}{1 - W_B} \approx 0.492 \times (B - Y)$$

$$V = V_{max} \frac{R - Y}{1 - W_R} \approx 0.877 \times (R - Y)$$

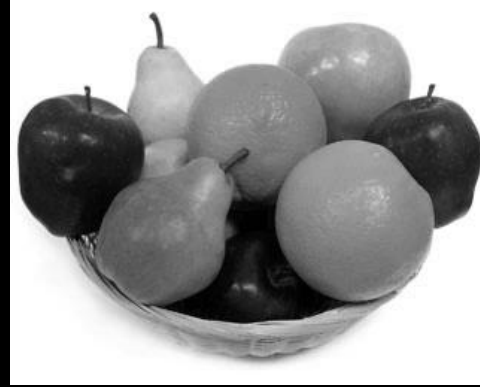
Assuming  $R, G, B$  and  $Y$  are in the range  $[0,1]$

$$U \in [-U_{max}, U_{max}] \text{ and } V \in [-V_{max}, V_{max}]$$

Together:  $YUV$



$Y$



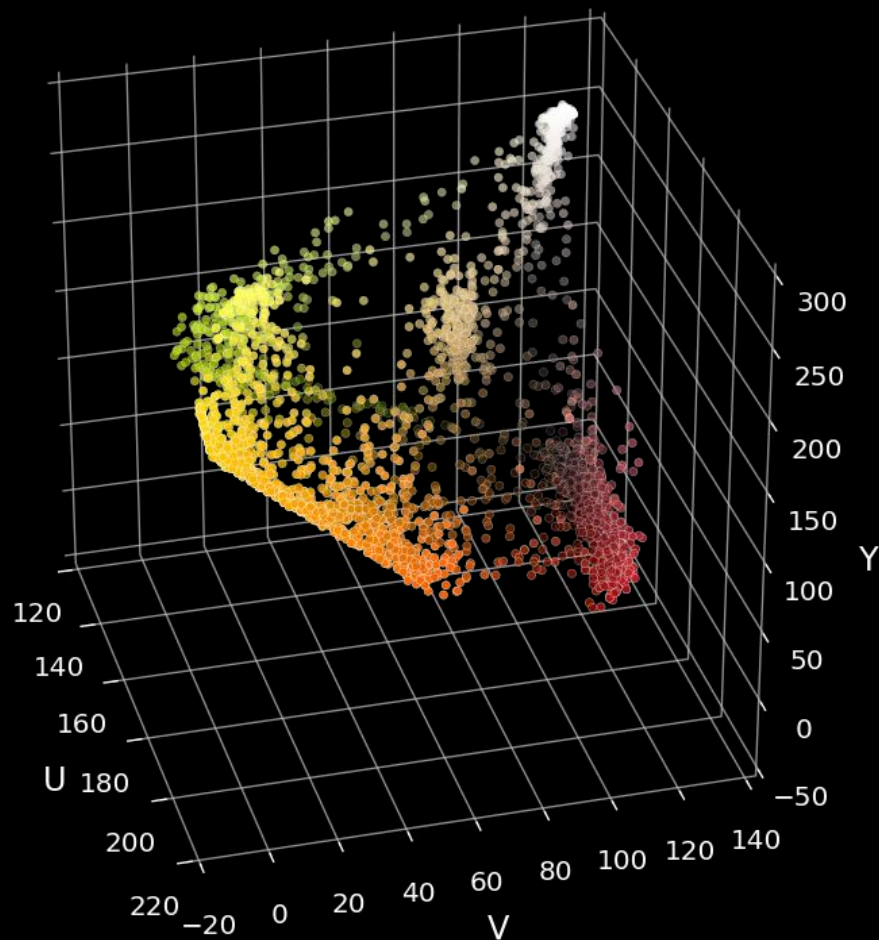
$U$

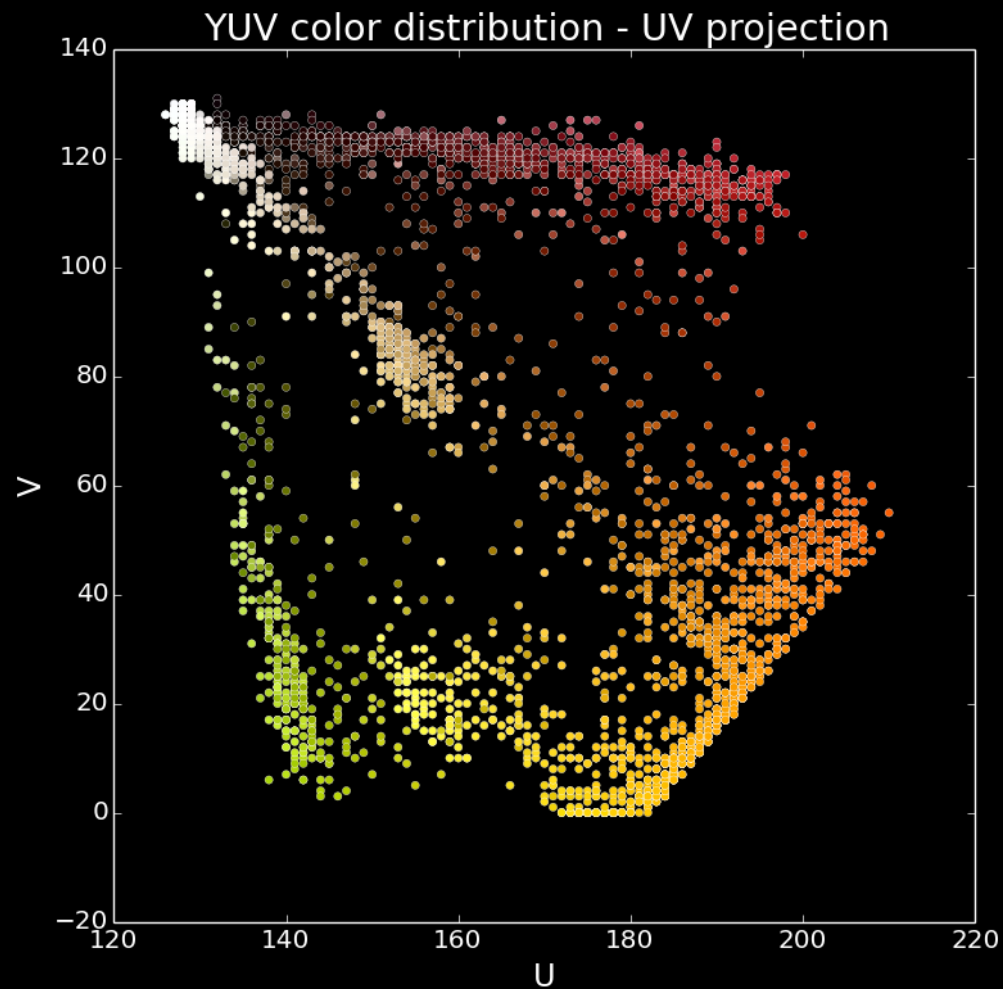


$V$



YUV color distribution







# Quiz: UV filter

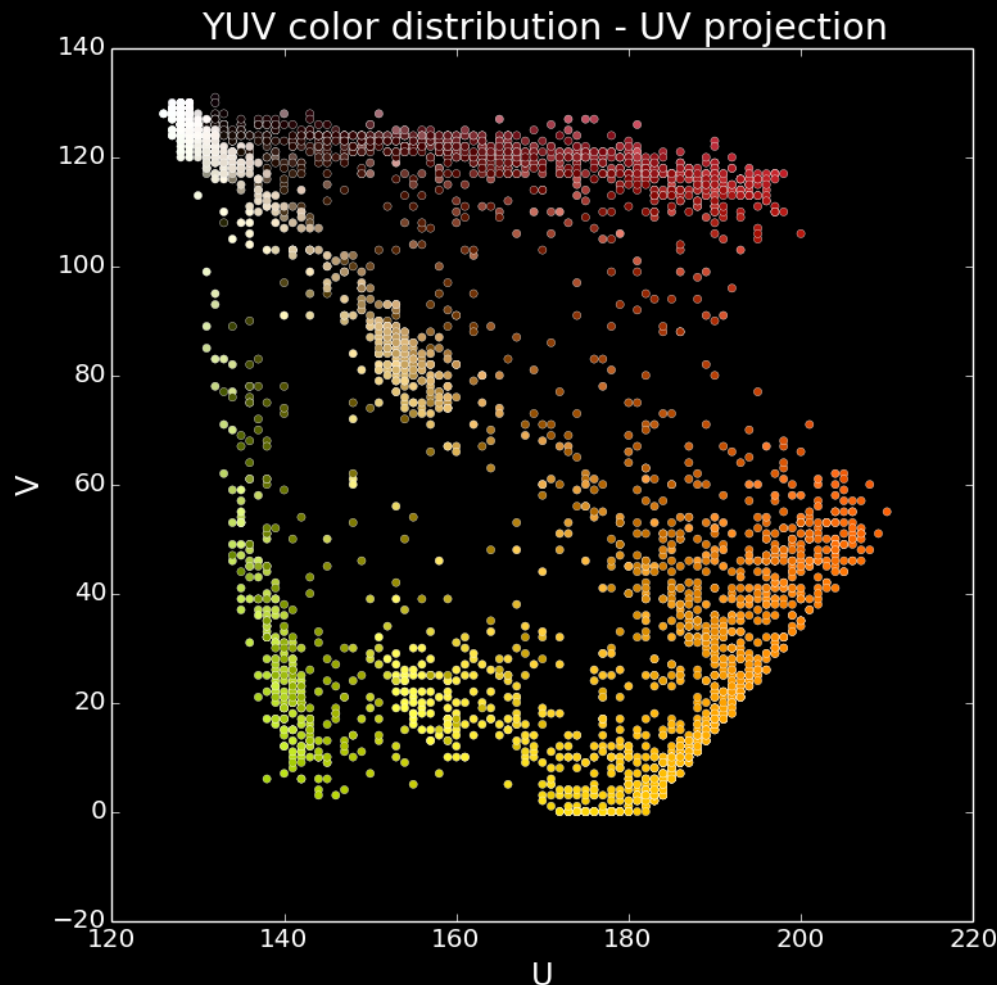
What UV limits  
should we use to  
extract red regions?

Filter:

$$Y \in [0, 255],$$

$$U \in [\text{ } , \text{ }],$$

$$V \in [\text{ } , \text{ }]$$

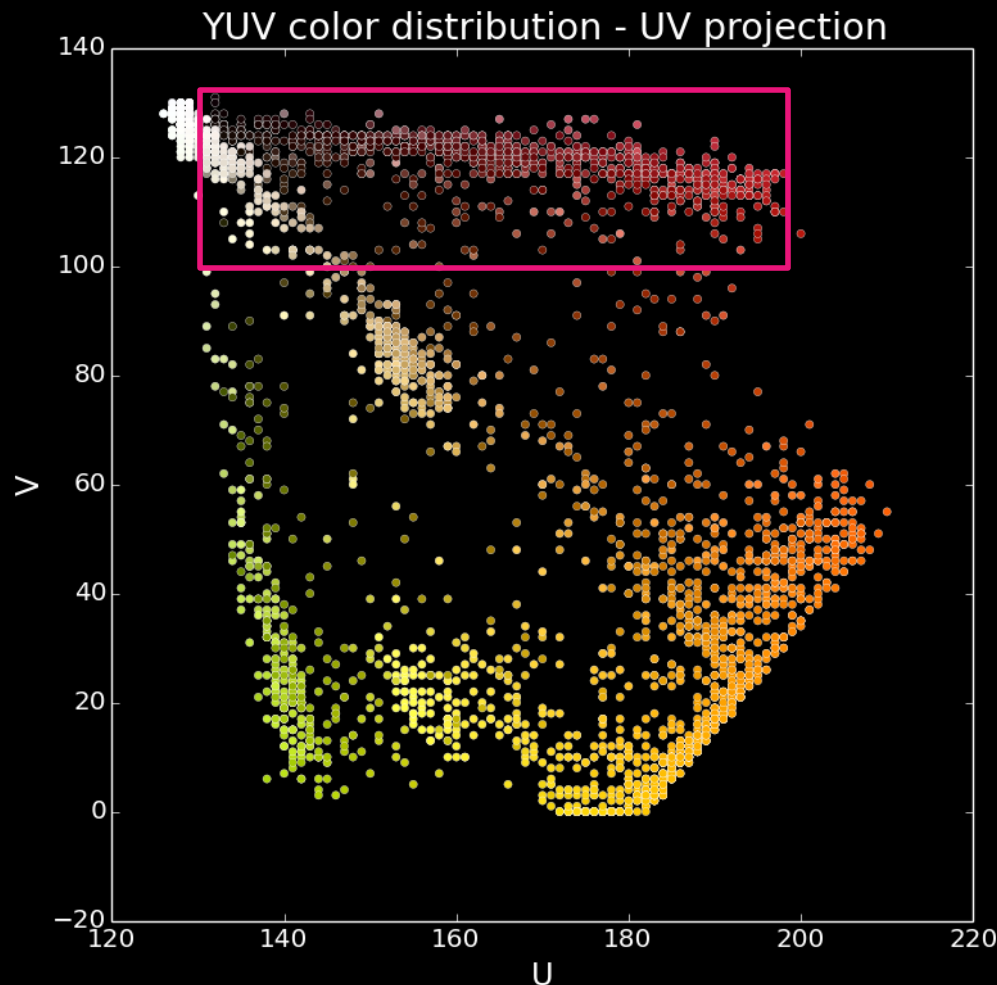


# Quiz: UV filter

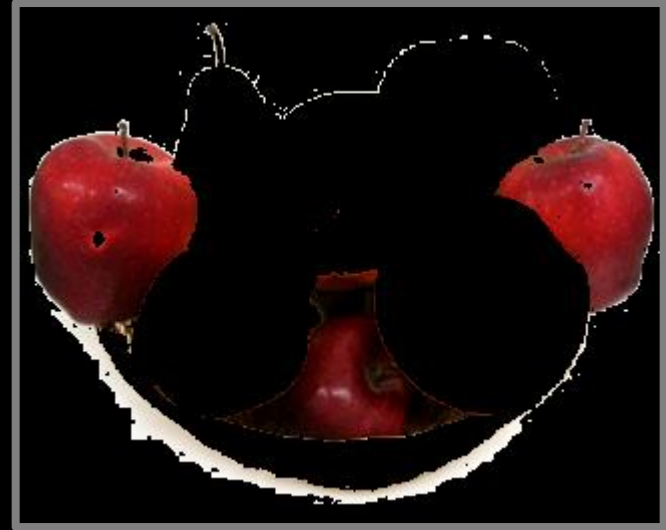
What UV limits  
should we use to  
extract red regions?

Filter:

$$\begin{aligned} Y &\in [0, 255], \\ U &\in [130, 200], \\ V &\in [100, 130] \end{aligned}$$

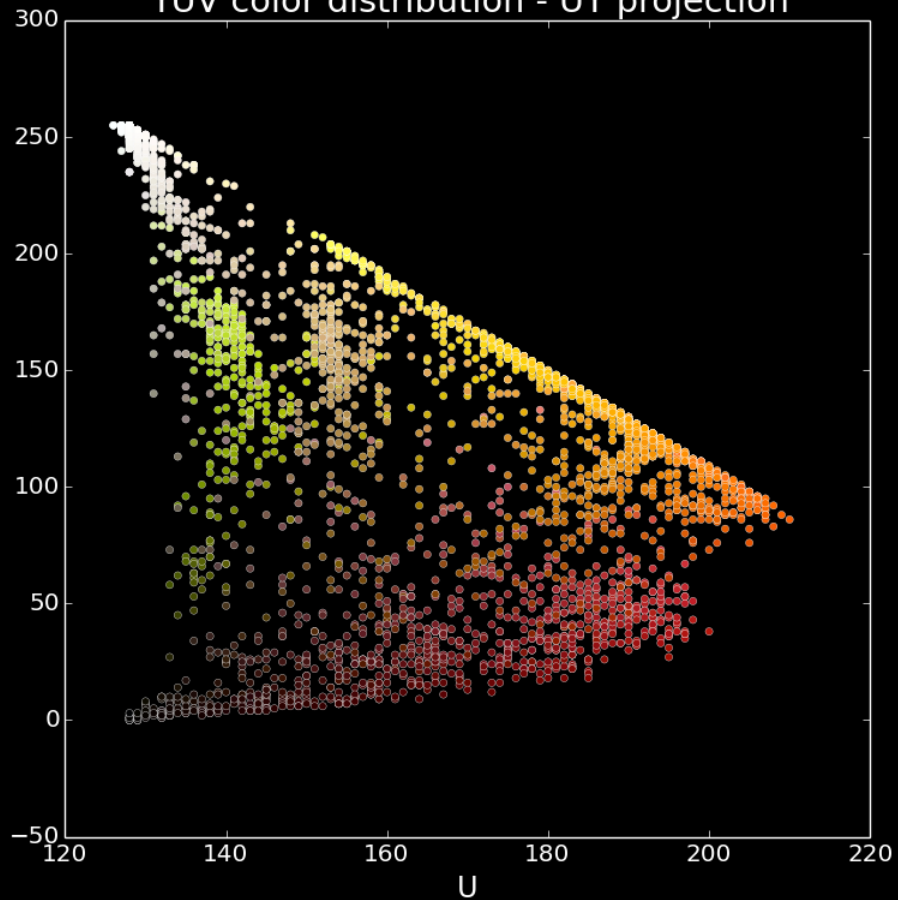


# UV filter

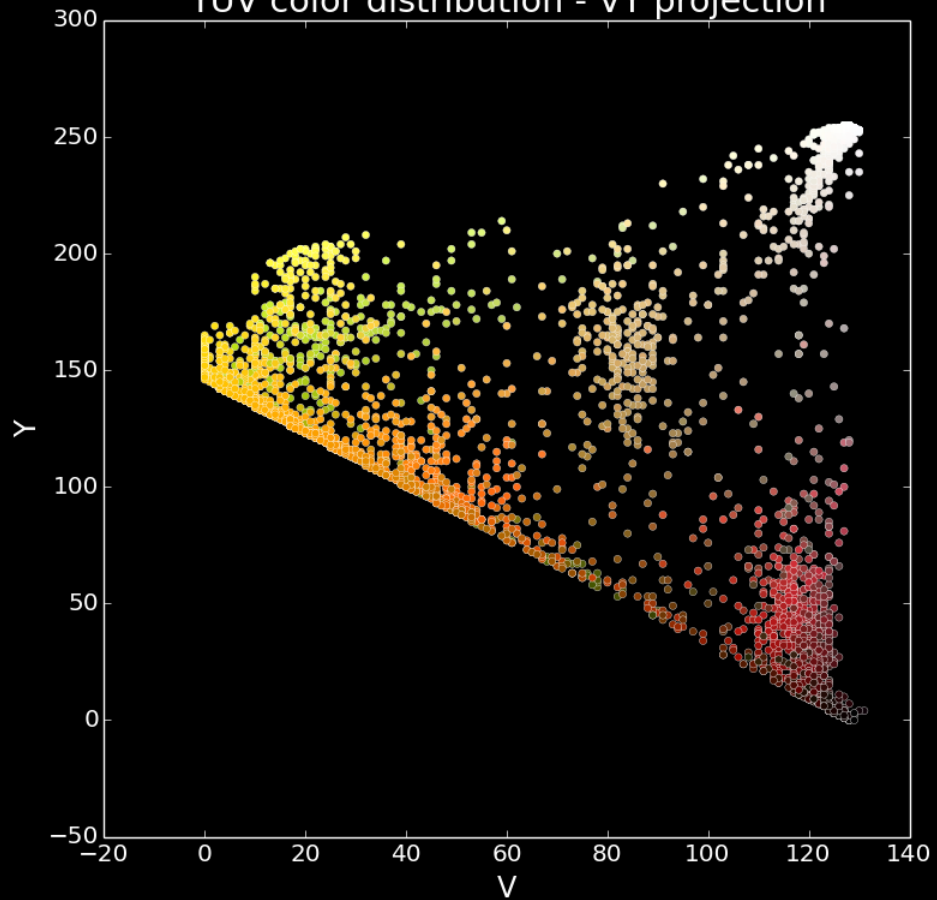


Filter:  $Y \in [0, 255]$ ,  
 $U \in [130, 200]$ ,  
 $V \in [100, 130]$

YUV color distribution - UY projection



YUV color distribution - VY projection



# YUV filter

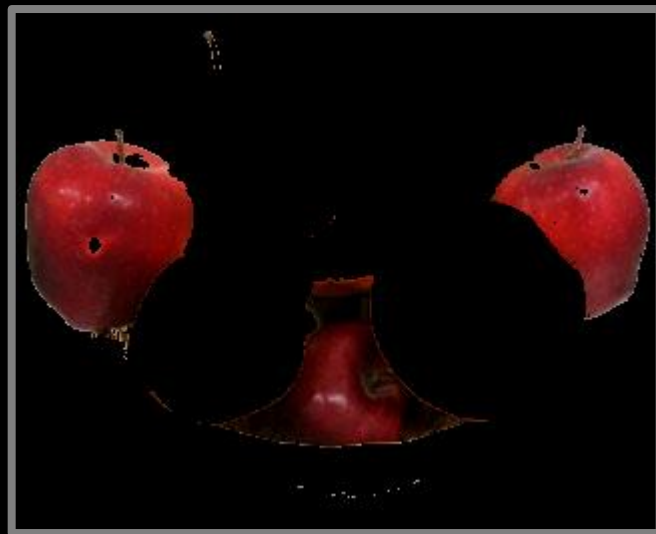


Filter:  $Y \in [0,150]$ ,  
 $U \in [130,200]$ ,  
 $V \in [100,130]$

# Comparing RGB and YUV filters



Filter:  $R \in [0,255]$ ,  
 $G \in [0,50]$ ,  
 $B \in [0,50]$



Filter:  $Y \in [0,150]$ ,  
 $U \in [130,200]$ ,  
 $V \in [100,130]$

# Intuition: Why YUV?

- Easier clustering of pixels
- Efficient encoding by *chroma subsampling*
  - Recall, human vision is more sensitive to intensity changes
  - Y channel can now use more bits
- E.g., YUV422 – to represent 2 image pixels, it uses 2 bytes for Y, and 1 byte each for U and V

# Other luma-chroma color spaces

- $YC_bC_r/YP_bP_r$  – video transmission, compression
- CIE  $L^*a^*b^*$ 
  - Based on human perception
  - Intensity channel:  $L^*$  = lightness
  - Color-opponent:  $a^*$  = red-green,  $b^*$  = blue-yellow
- CIE  $L^*u^*v^*$  – like  $L^*a^*b^*$  but easier to compute



# Back to plotting image pixels

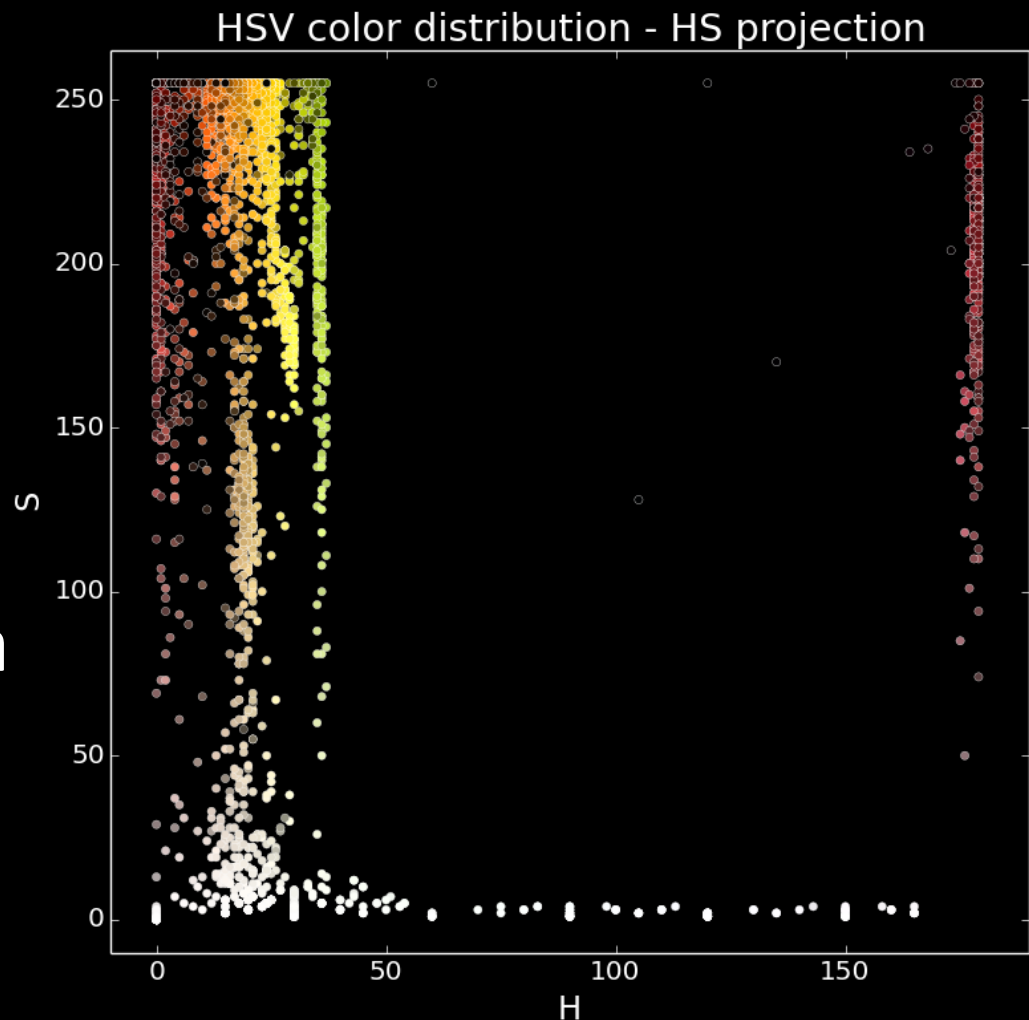


# Plotting in HSV

Focus on HS  
projection  
– what do you see?

Colors spread along a  
single dimension!

*Hue*

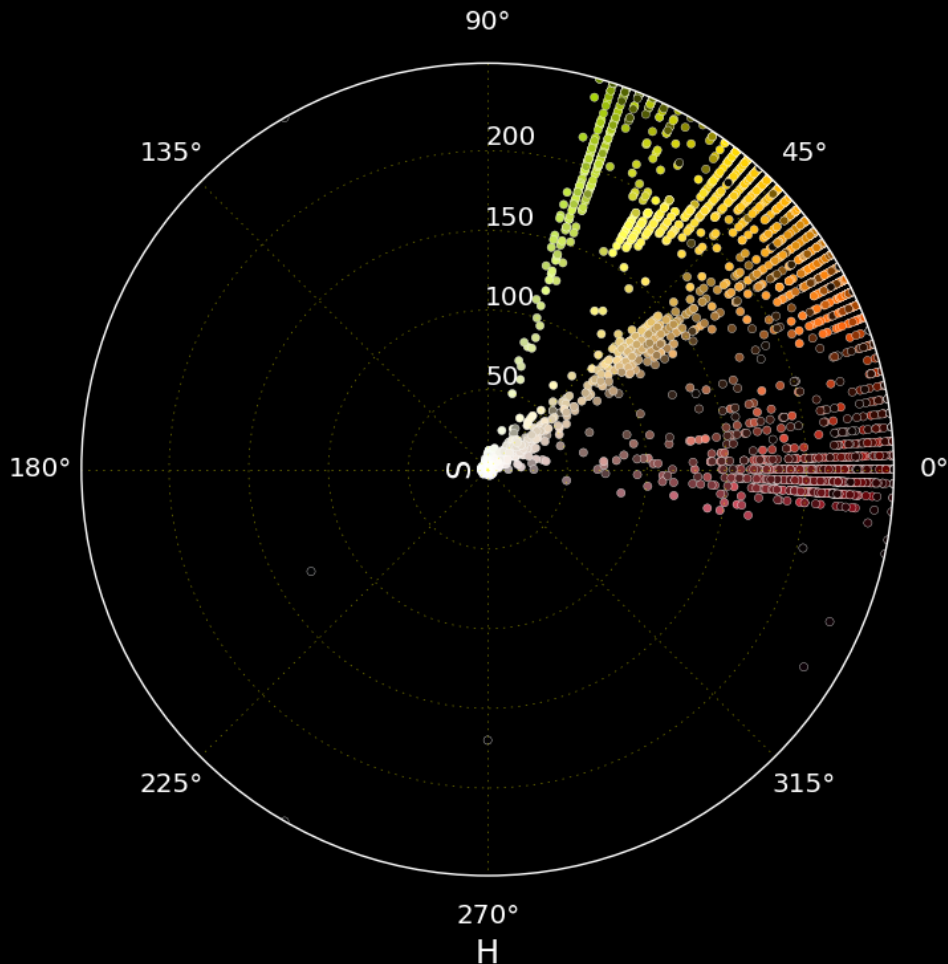


# A better HS plot

Treat hue as an angle

- Reds from both ends of the spectrum now in proximity
- Better reflects the role of saturation (radius or distance from center)

HSV color distribution - HS polar projection



# Exercise: HSV filter

- Filter this image in HSV to select red apples
- Compare best results from RGB, YUV,  $L^*a^*b^*$

