

# CS 571 - Data Visualization & Exploration

Color

Instructor: Hamza Elhamdadi



UMassAmherst

## Upcoming Dates

**Feb 13: Announce Your Project**

**Feb 14: ~~Group~~ Activity 1 Due**

**Feb 14: Homework 1 Due**

## Some More Details

Office Hours start this week  
(see the syllabus for times)

Lectures will be recorded via Echo360  
(the first three are already up!)

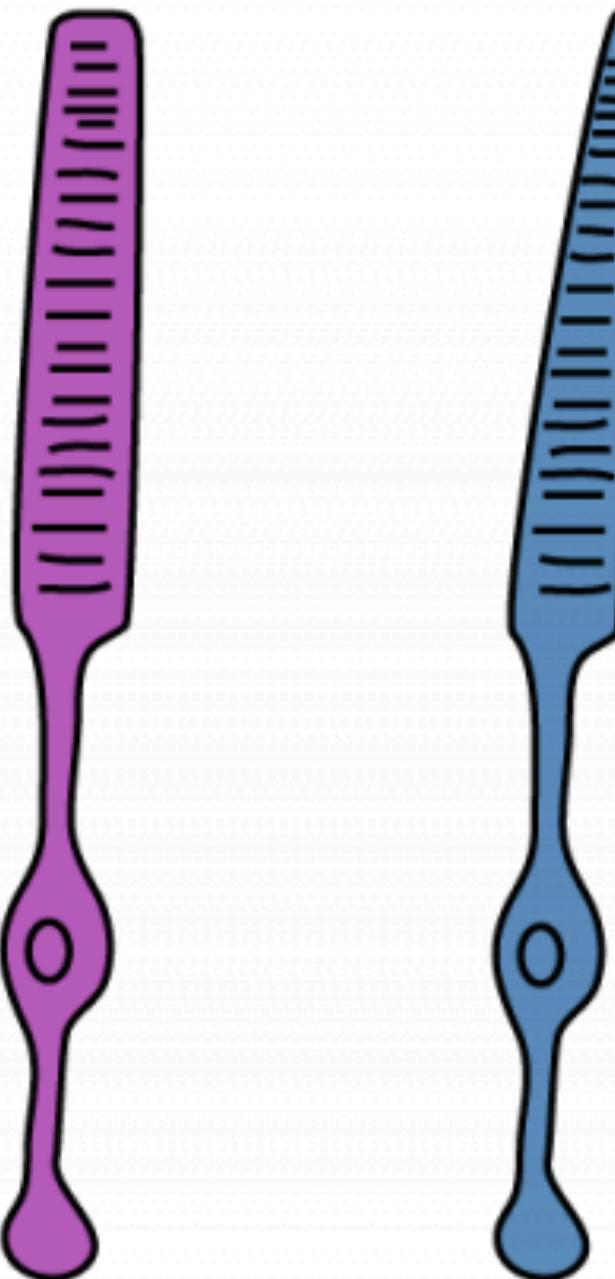
**Make sure at least one member from your  
project team attends class on Feb 13**

# How do we perceive color?

**~120 million rods**

**More sensitive to light**

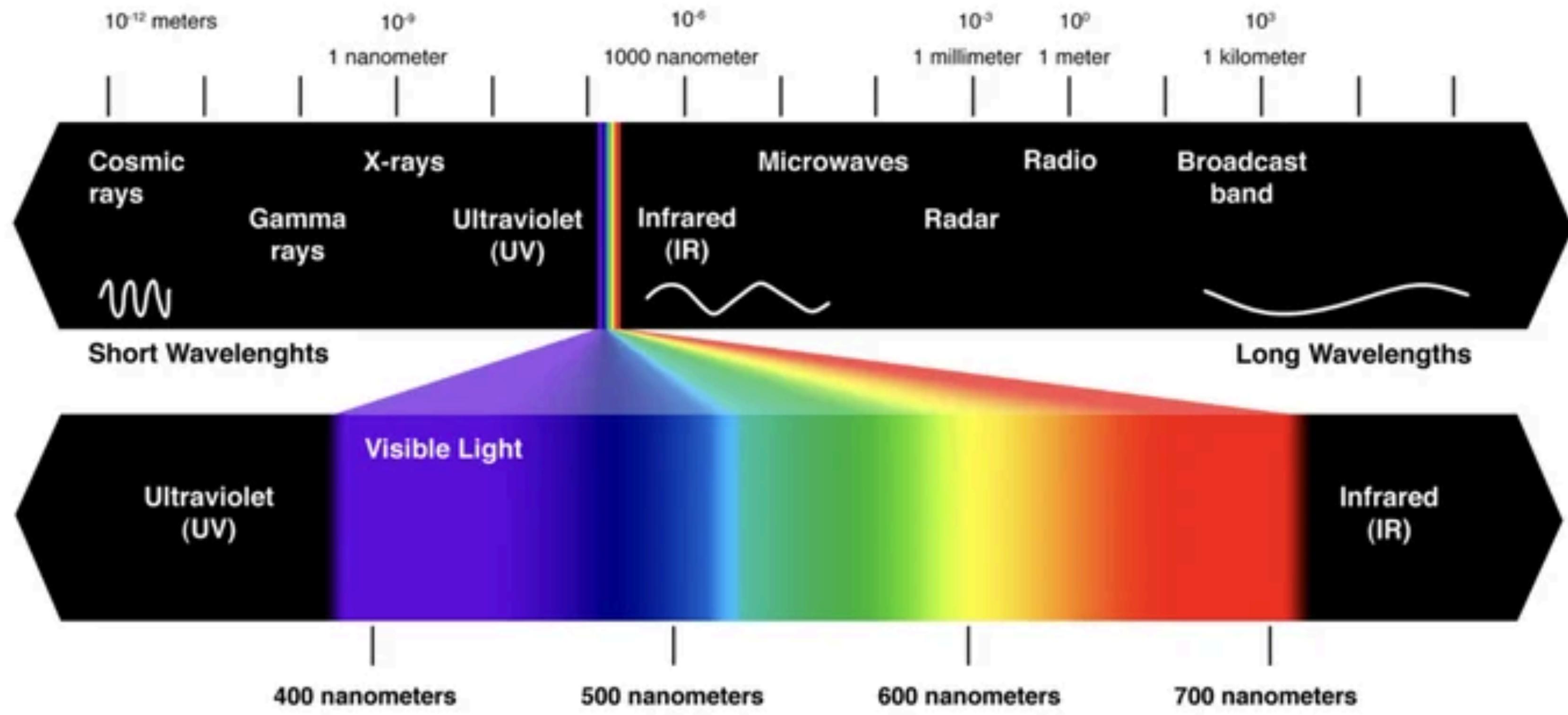
**Responsible for low-light vision**



**~5-6 million cones**

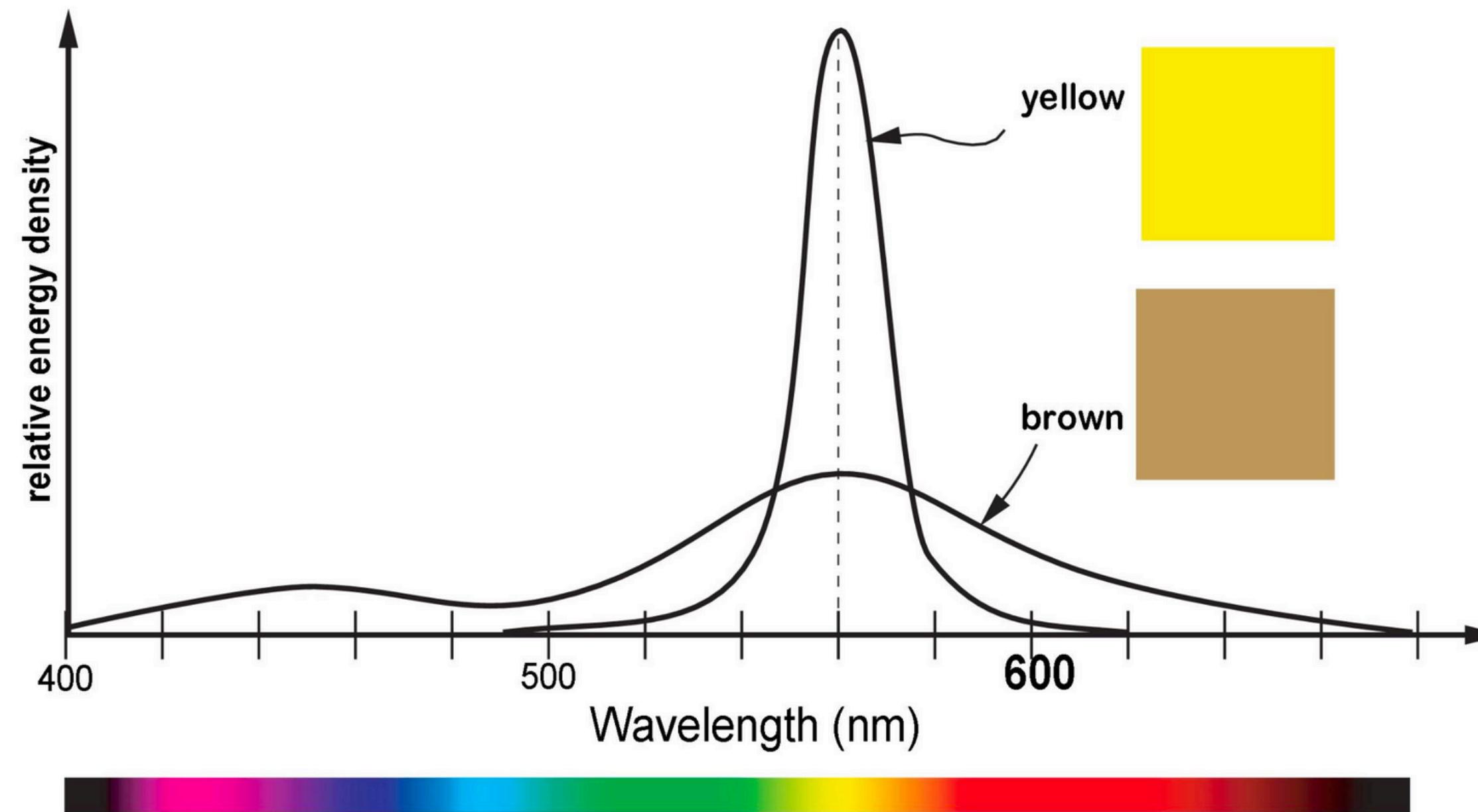
**Less sensitive to light**

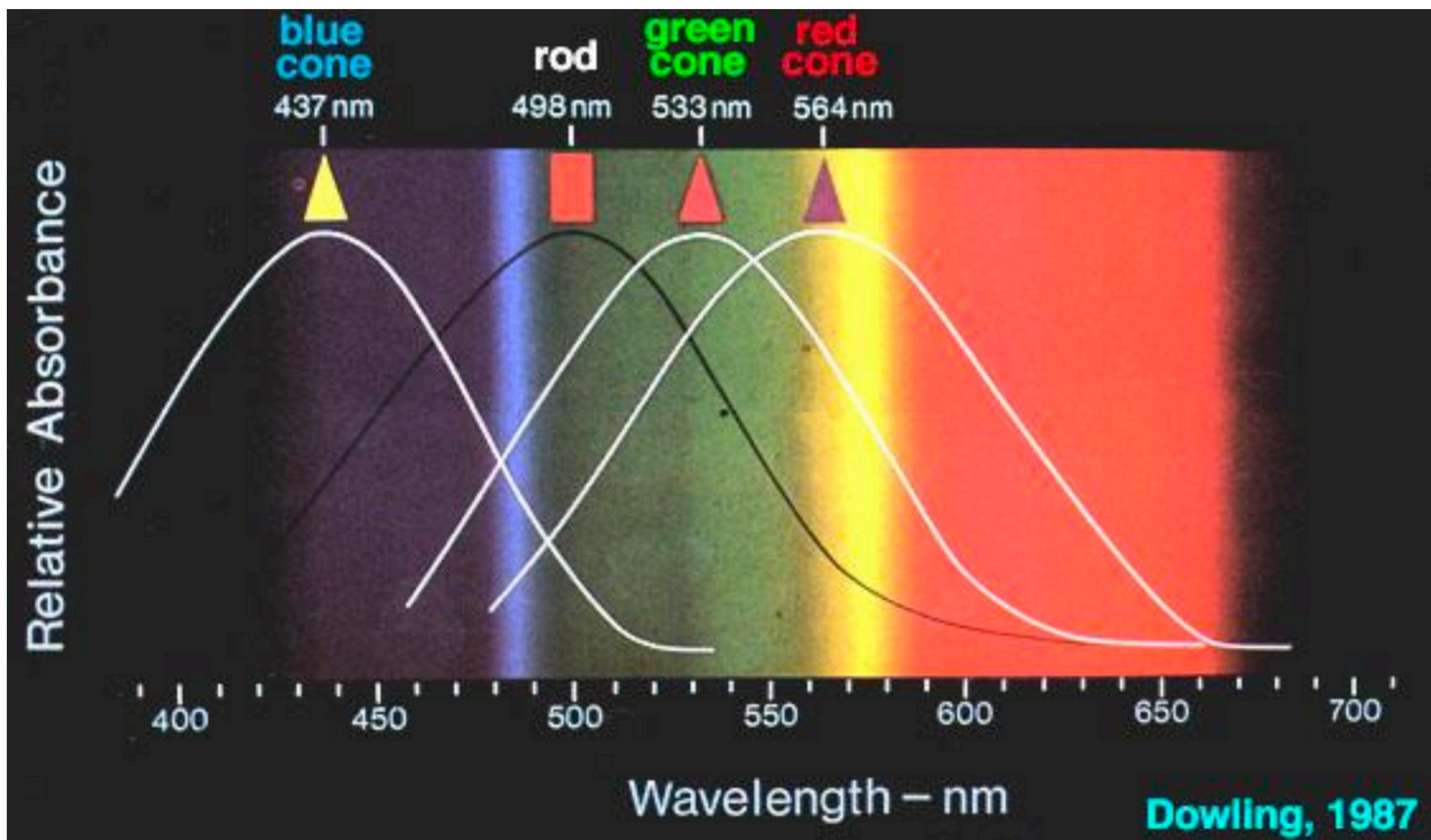
**Responsible for color vision**



# Color Perception is more than just Wavelength

It's a combination of wavelength and energy density







MAY 21, 2012

## Rippin' the Rainbow a New One

[Play](#)[Transcript](#)Image credits: [jared](#)

We tear into this show with a dark scene from 1665. A young Isaac Newton, hoping to ride out the plague by heading to the country to puzzle over the deep mysteries of the universe, finds himself wondering about light. And vision. He wants to get to the bottom of where color comes from--is it a physical property in the outside world, or something created back inside your eyeball somewhere? James Gleick explains how Newton unlocked the mystery of the rainbow. And, as Victoria Finlay tells us, sucked the poetry out of the heavens.

 THE LAB

UNLOCK MEMBER-ONLY  
EXCLUSIVES AND  
SUPPORT THE SHOW

EXCLUSIVE PODCAST EXTRAS

ENTIRE PODCAST ARCHIVE

LISTEN AD-FREE

BEHIND-THE-SCENES CONTENT

VIDEO EXTRAS

ORIGINAL MUSIC & PLAYLISTS

[Become a member](#)

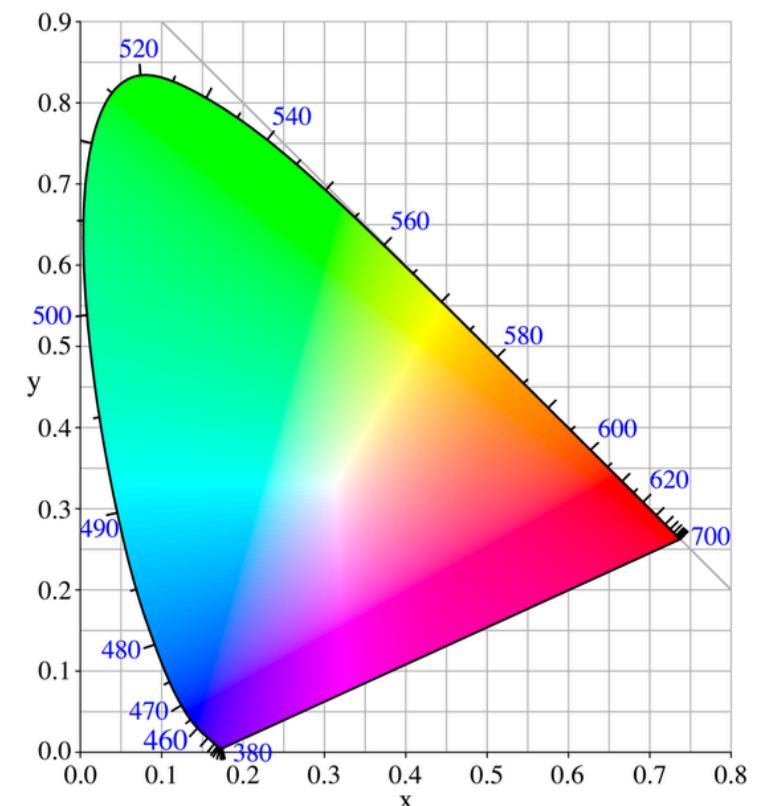
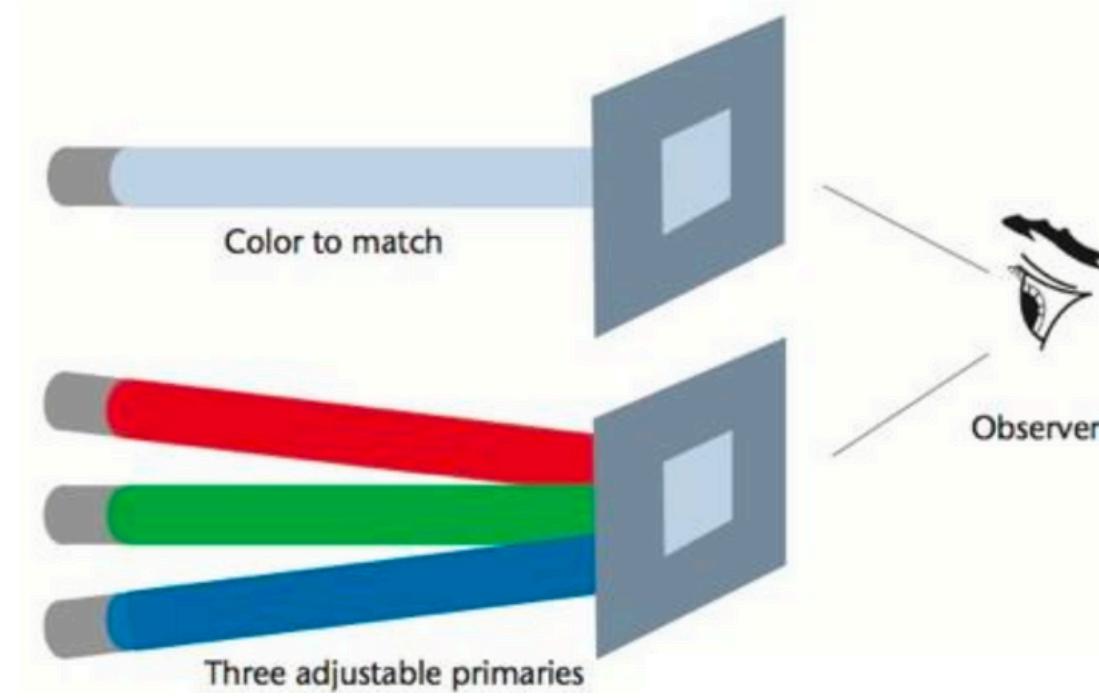
**How do we abstract/represent color?**

# Human Color Perception Space

International Commission on Illumination (CIE)  
Commission International de L'éclairage

In the 1920s and 1930s, CIE:

- conducted experiments to understand color perception
- found that humans can mimic any pure (visible) light by addition and subtraction of three primary lights



# Subtractive Color

Used by color printers

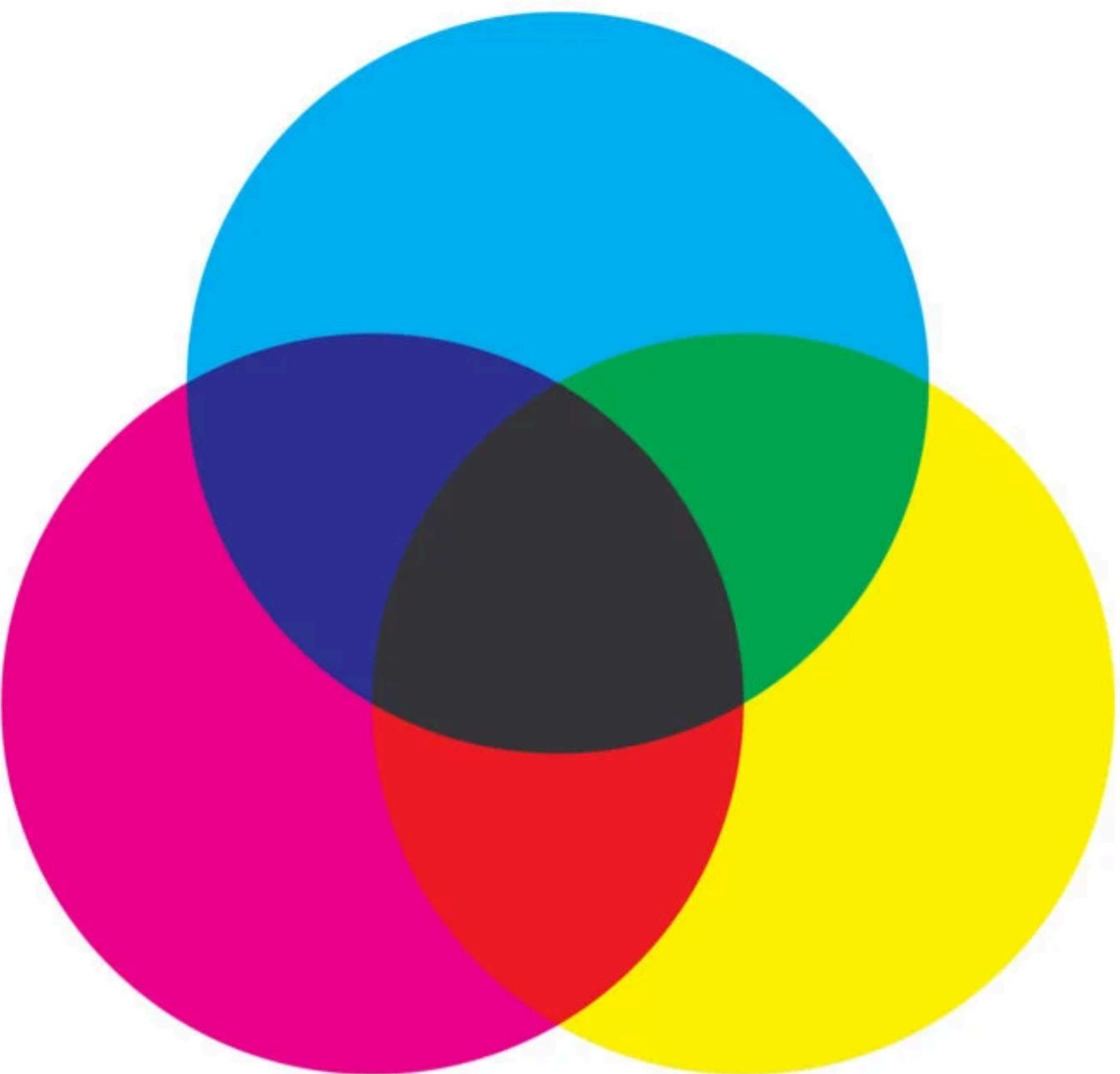
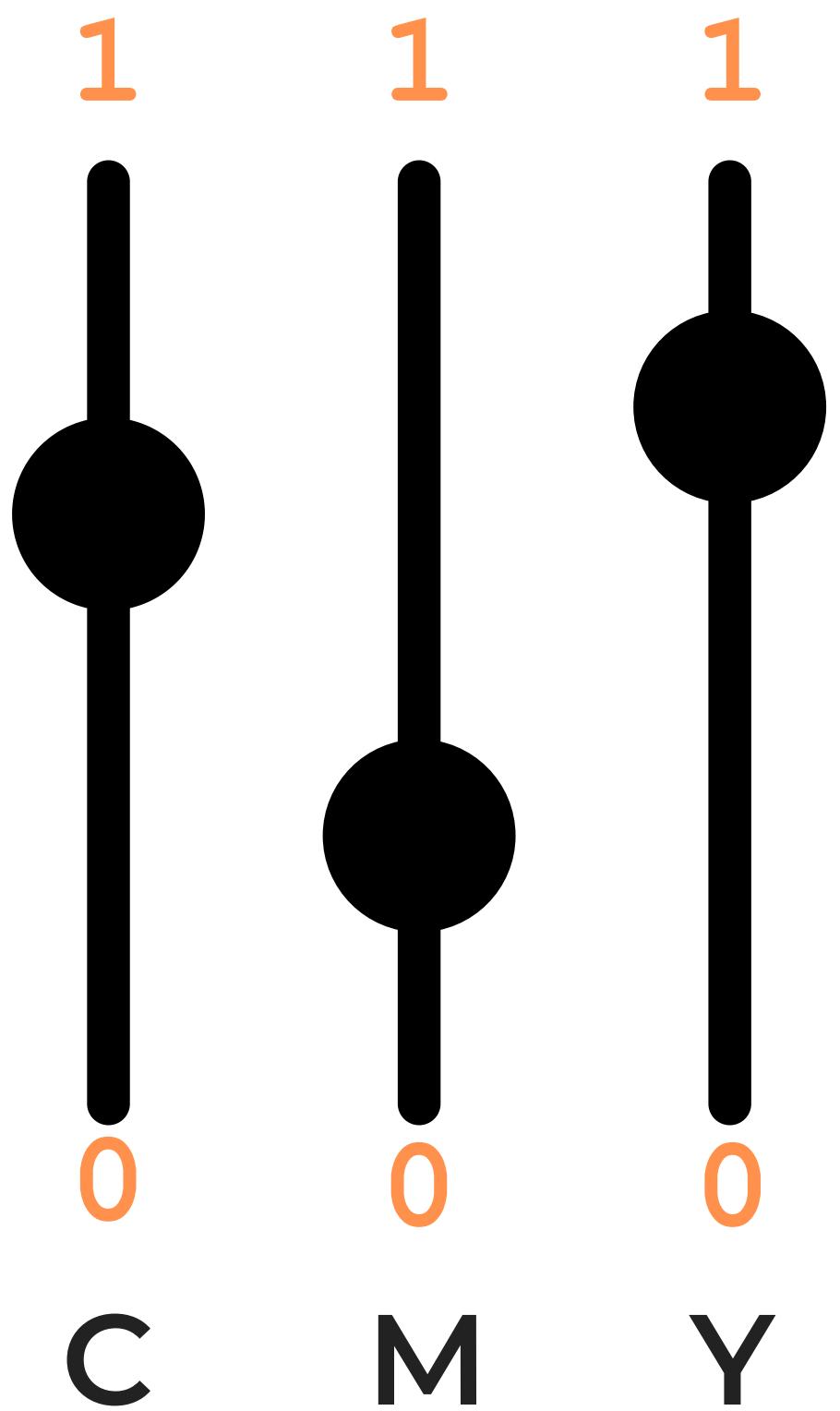
Primary Additive Colors: CMY

Secondary Additive Colors: RGB

C+M+Y approximates black, but  
printers will often use CMYK,  
where K is true black pigment



# Subtractive Color

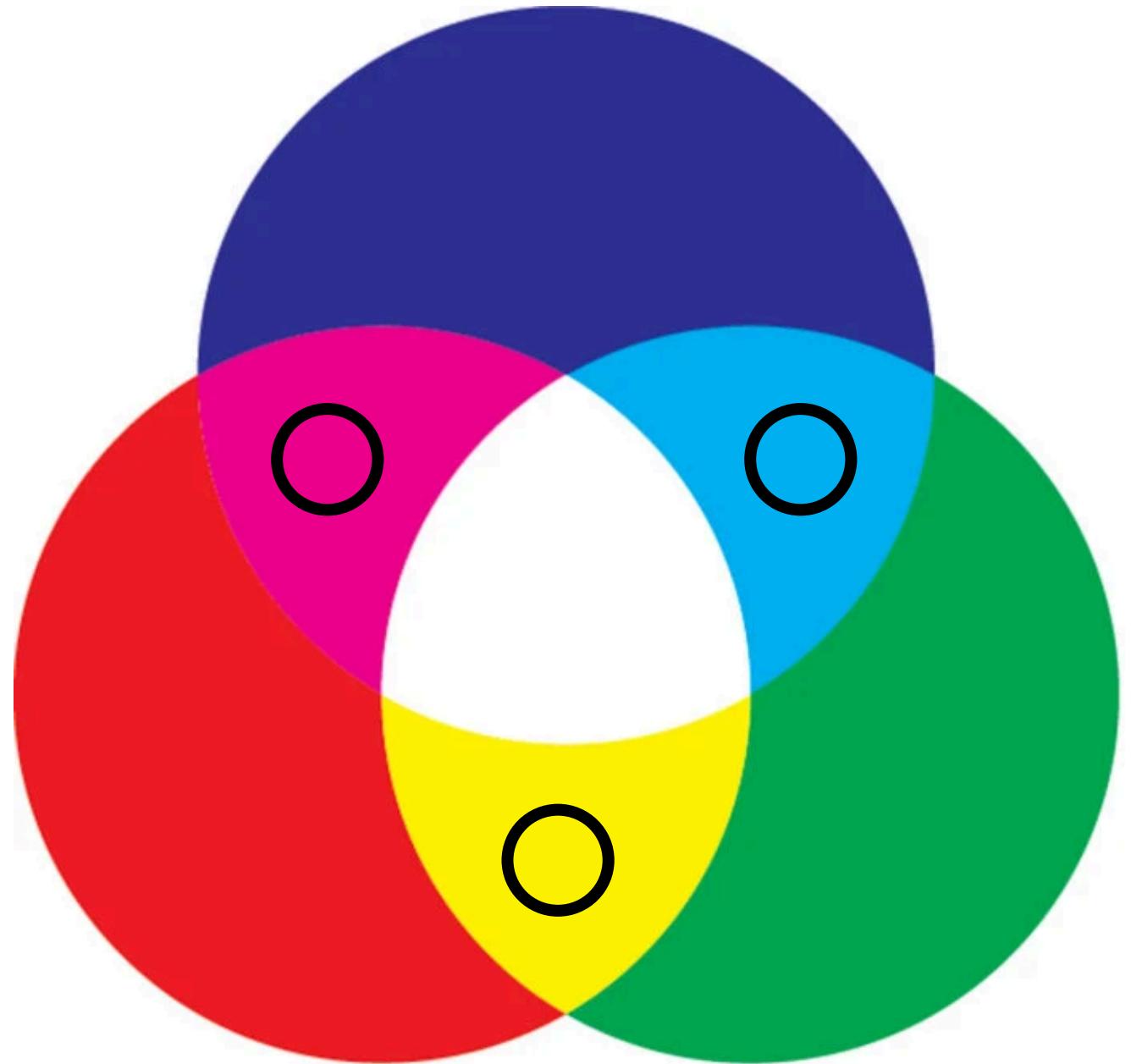


# Additive Color

How we see color from light

Primary Additive Colors: **RGB**

Secondary Additive Colors: **CMY**

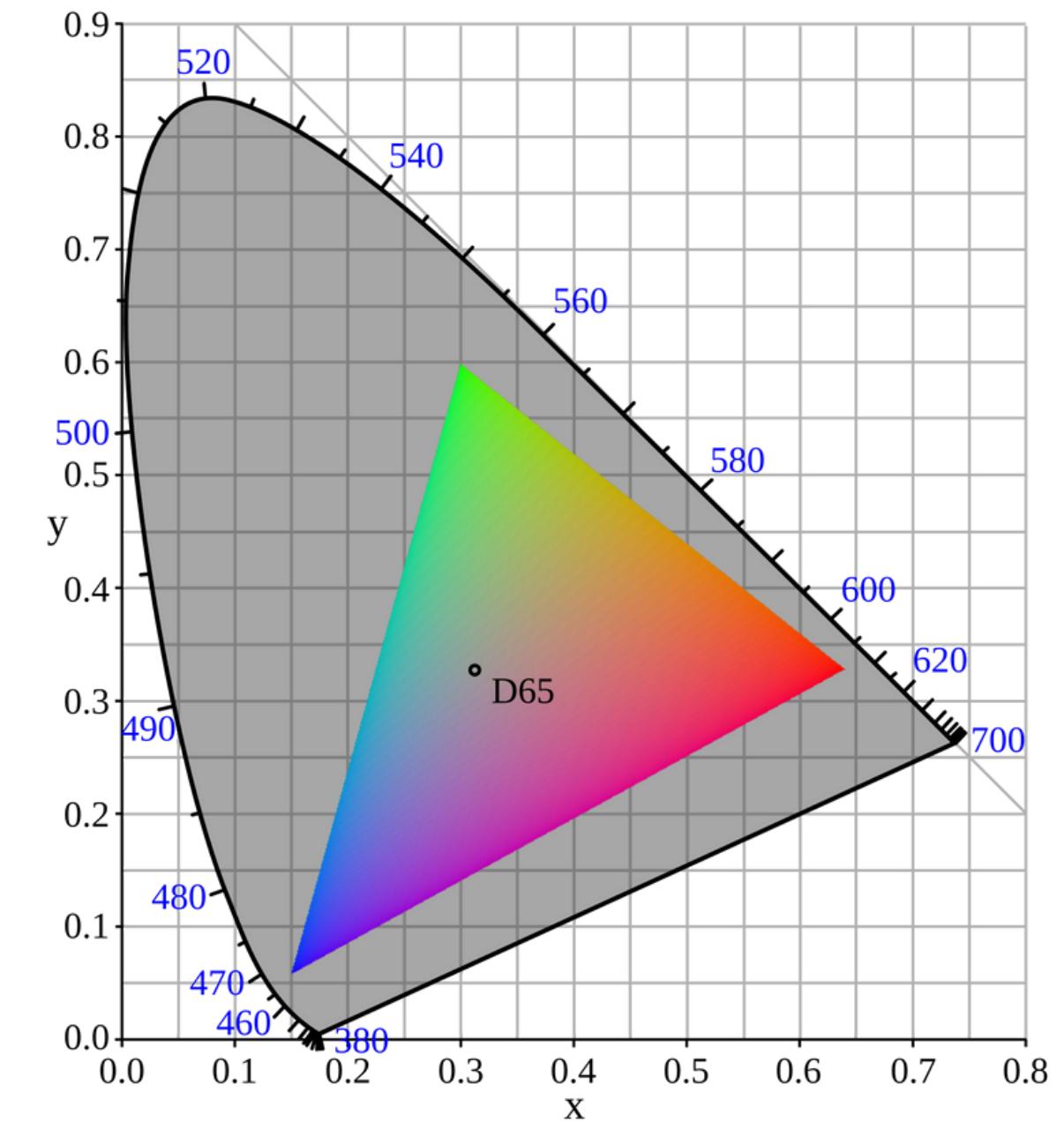


# Additive Color: RGB Color Space

Commonly used color space for monitors

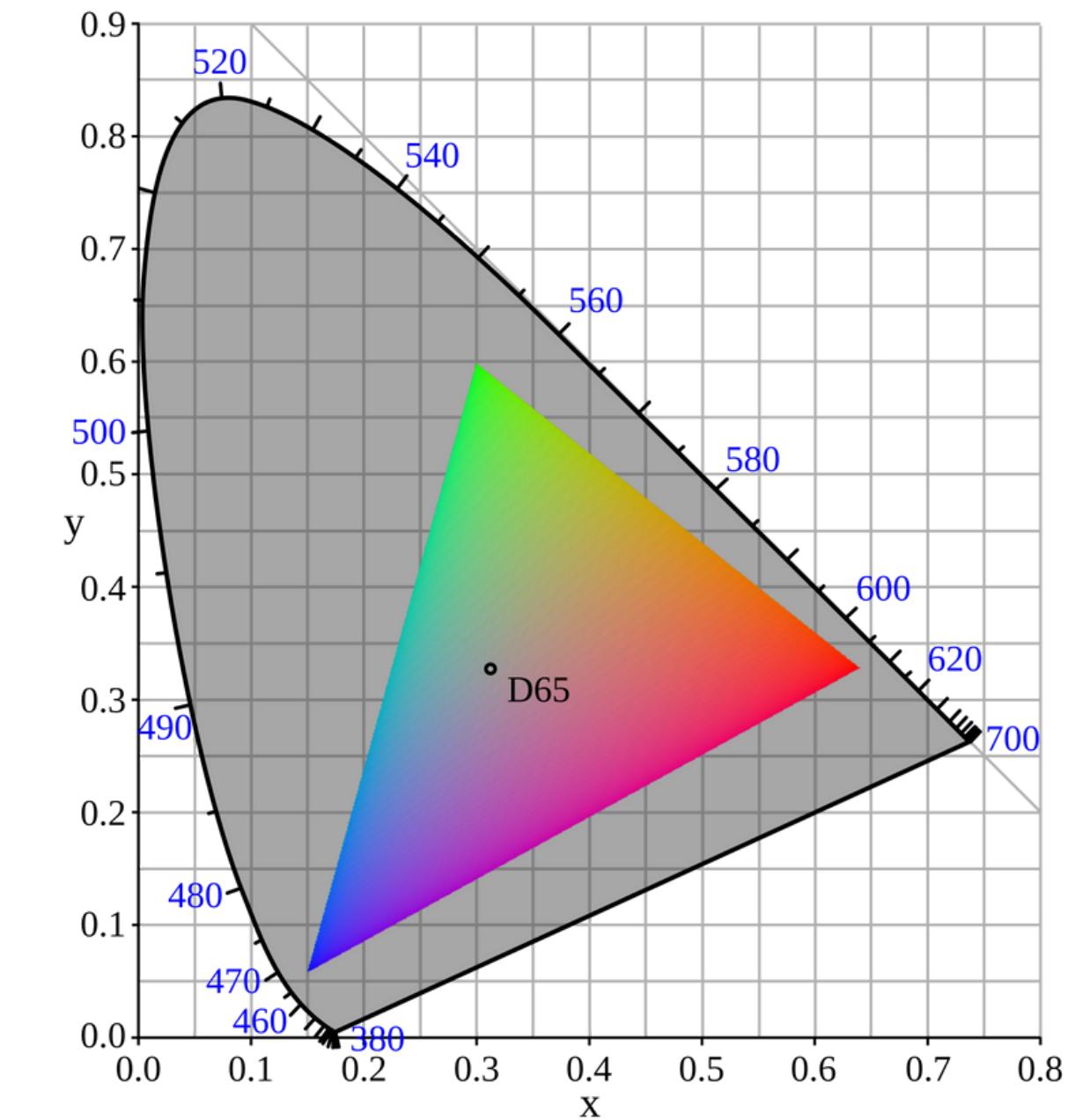
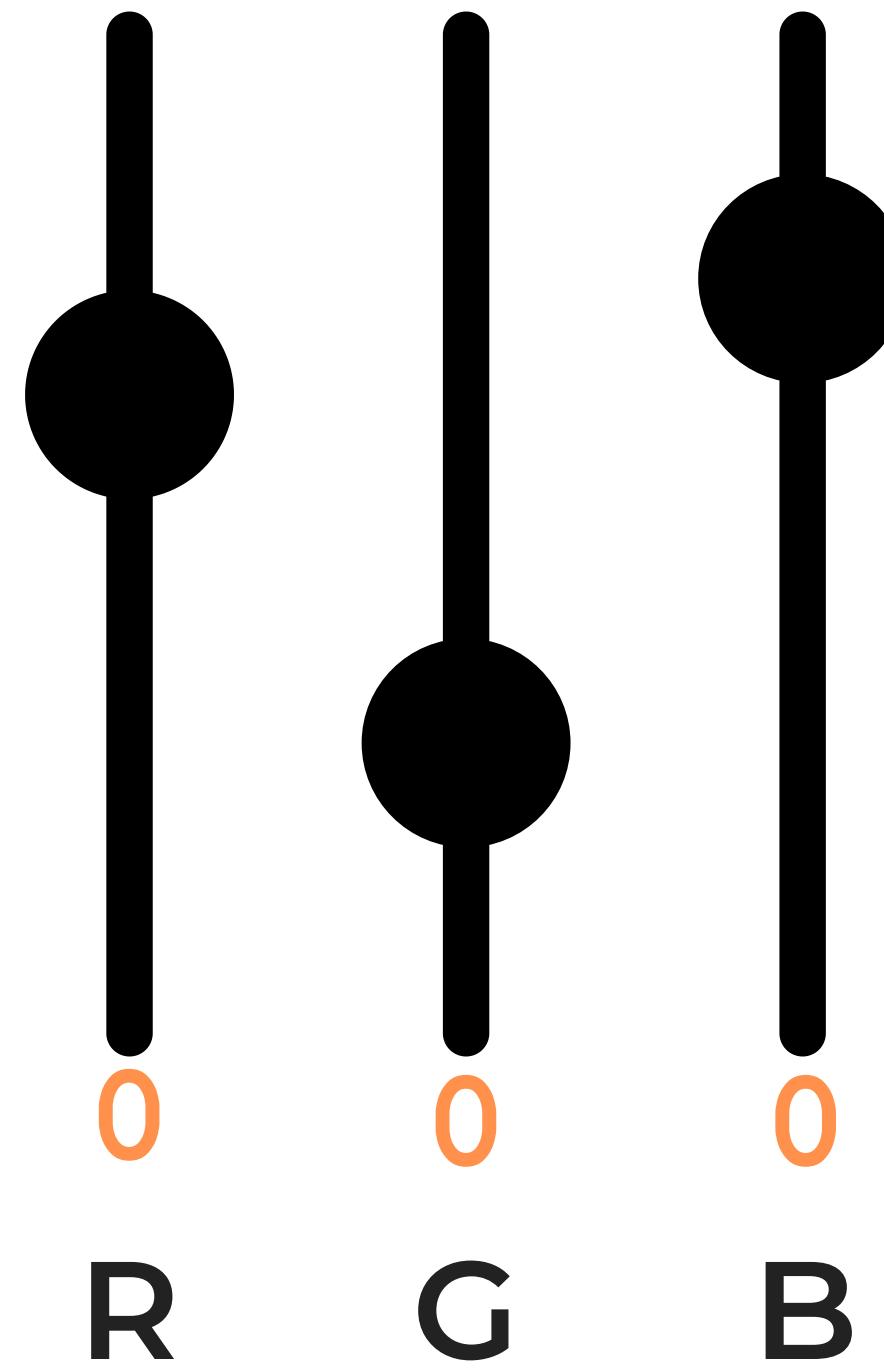
Not perceptually uniform

Actual color is device-dependent



# Additive Color: RGB Color Space

255 255 255



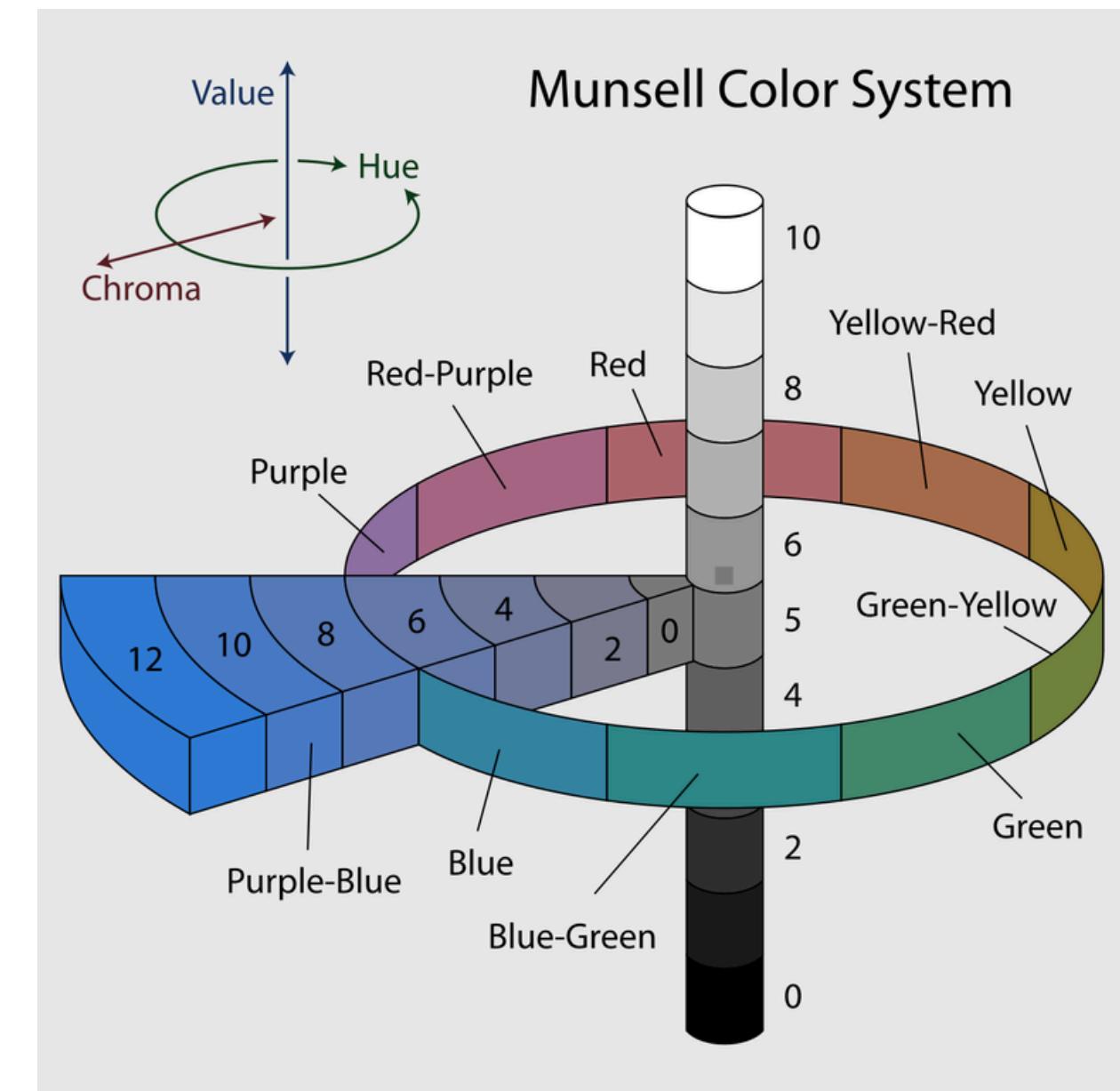
# Additive Color: HS[V,B,L,I] Color Space

Hue, Saturation, (Value or Brightness or Luminance or Intensity)

Polar coordinate representation of RGB

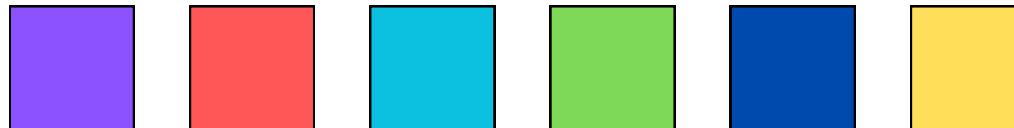
More intuitive than RGB for color tuning

Also not perceptually uniform

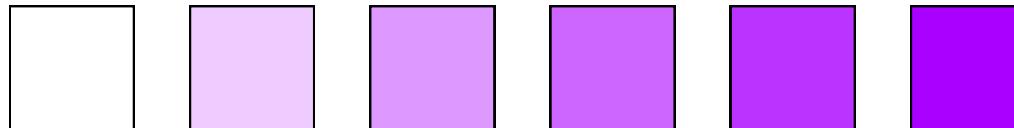


# Additive Color: HS[V,B,L,I] Color Space

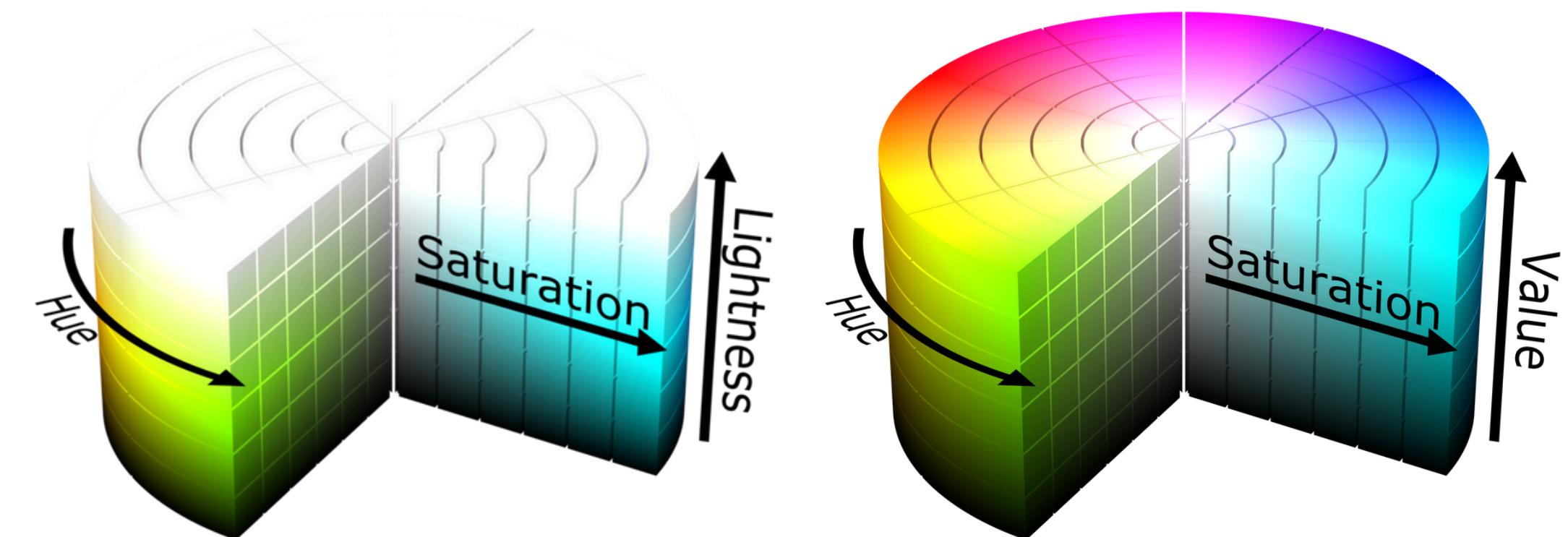
Hue: What you might think of when you hear “color”



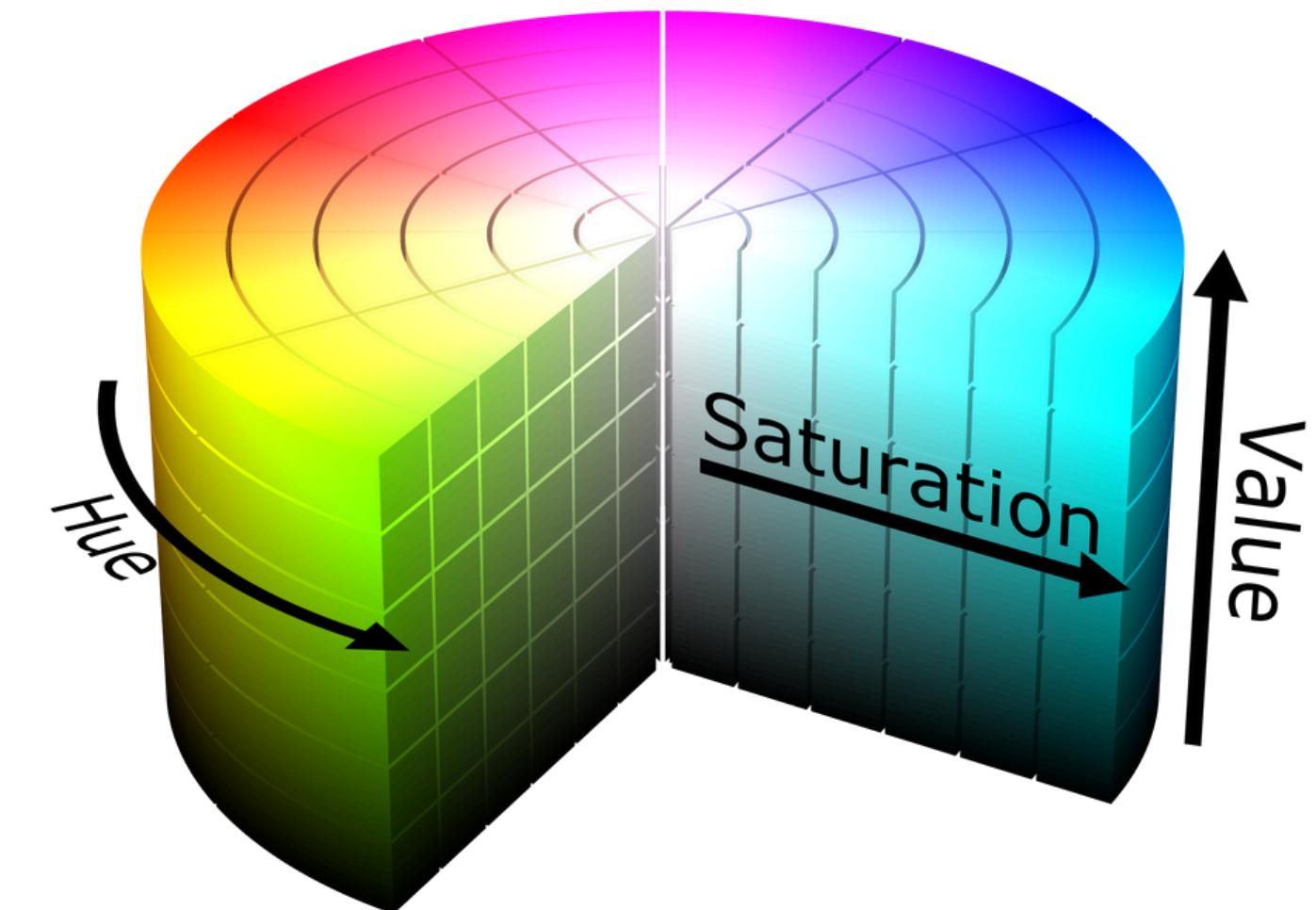
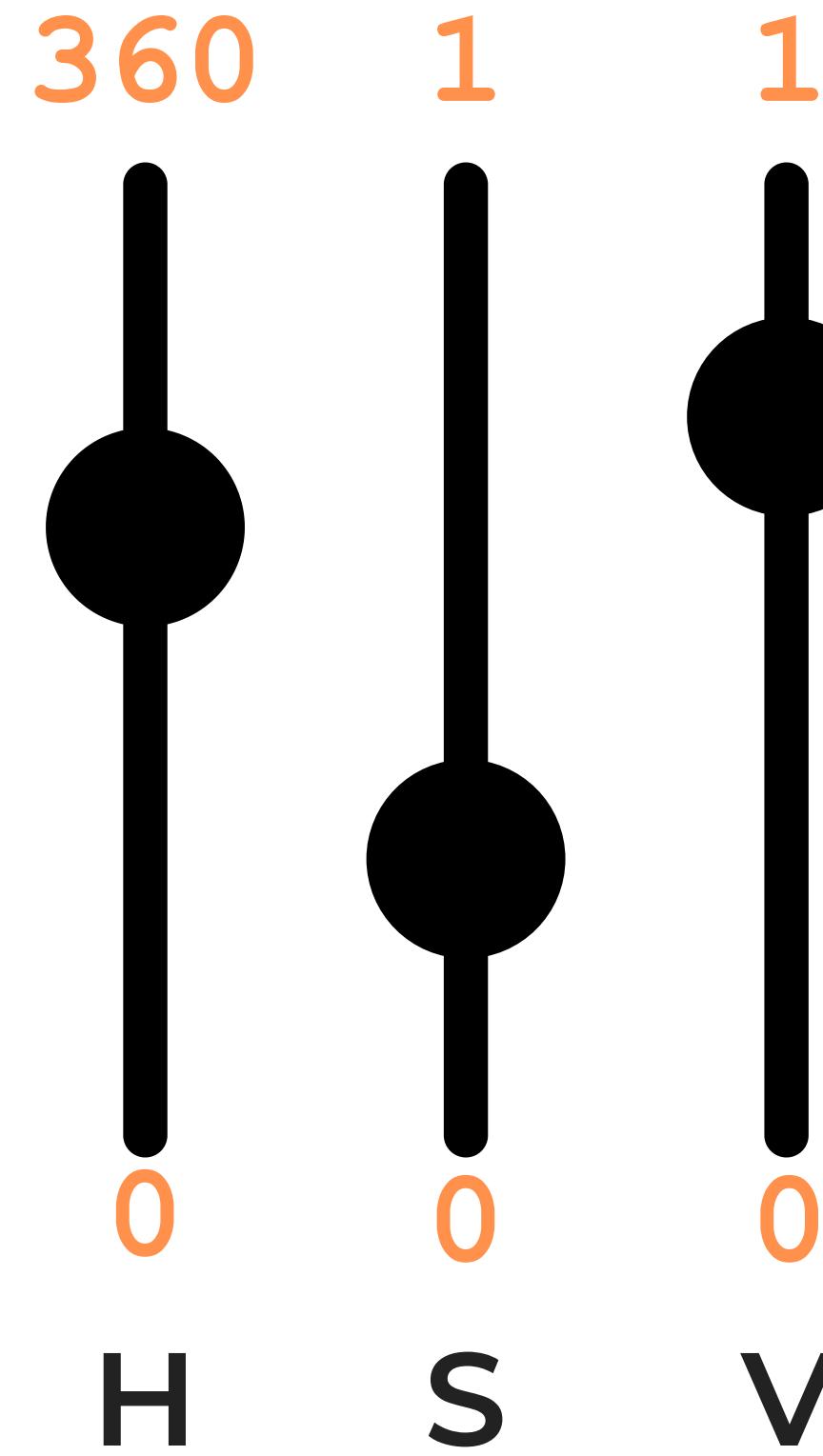
Saturation (or Chroma): Purity of the color compared to white



Luminance (or Value): Lightness (or darkness) of the color

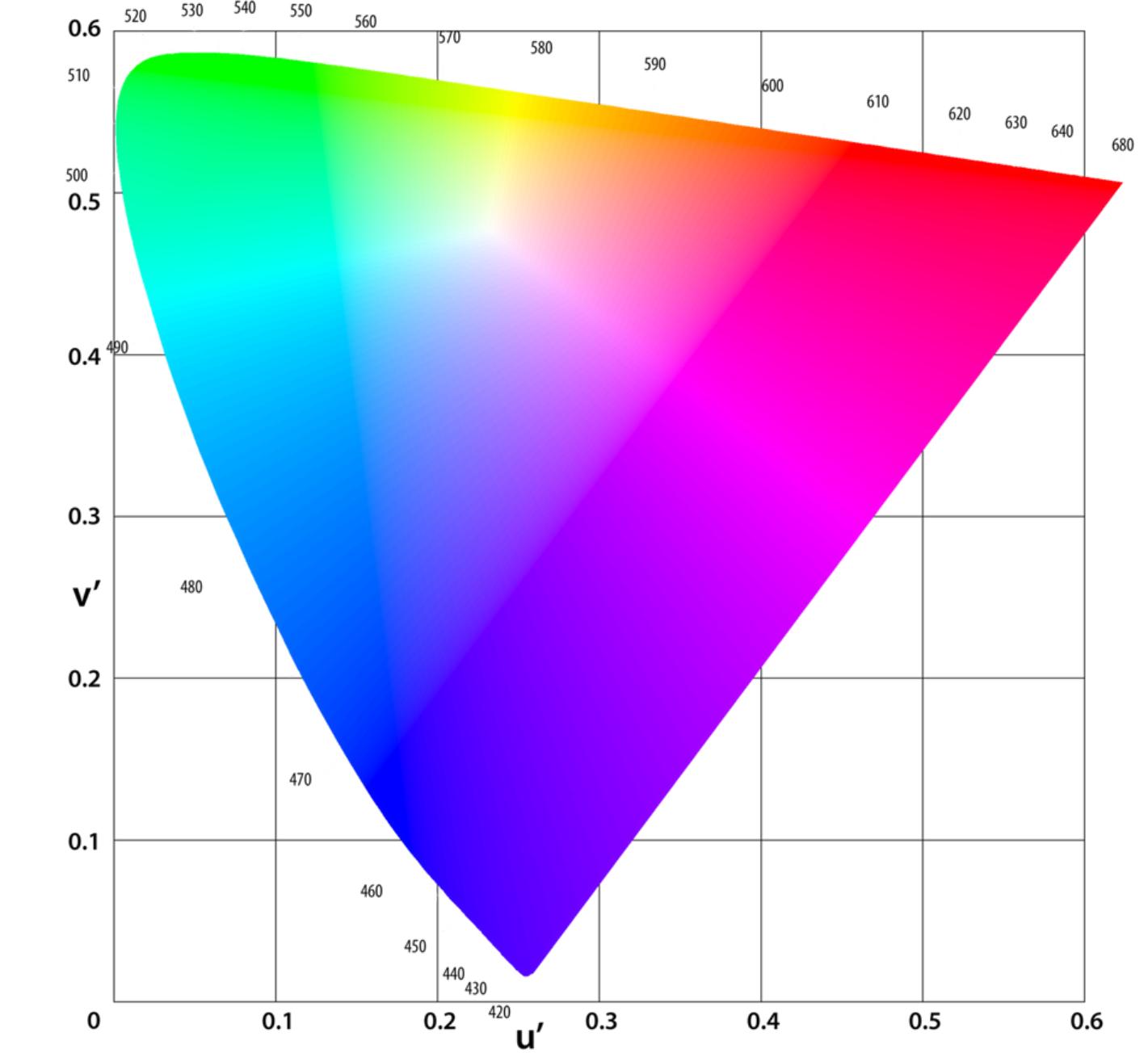
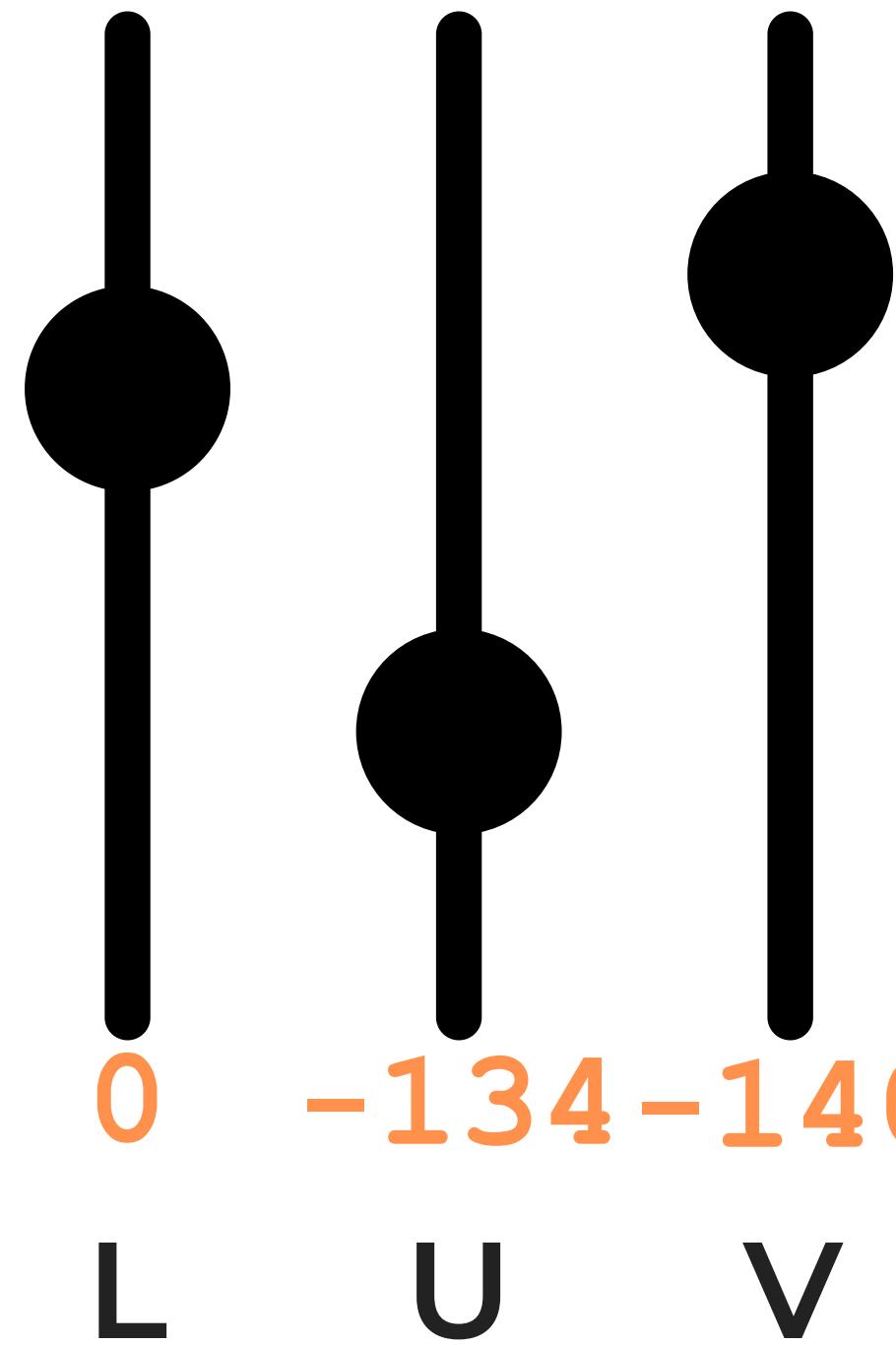


# Additive Color: HS[V,B,L,I] Color Space



# CIE LUV Color Space

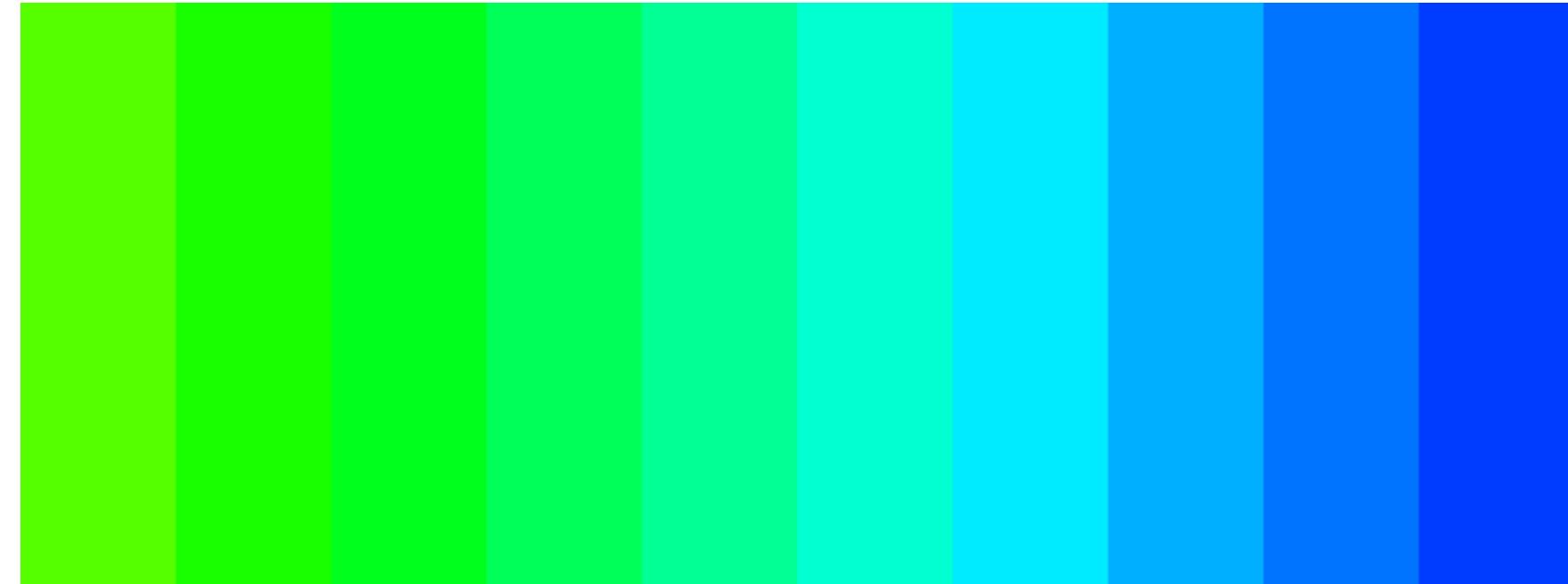
100 220 122



# Perceptual Uniformity

HSV color space

Not perceptually uniform



CIELUV color space

Perceptually uniform



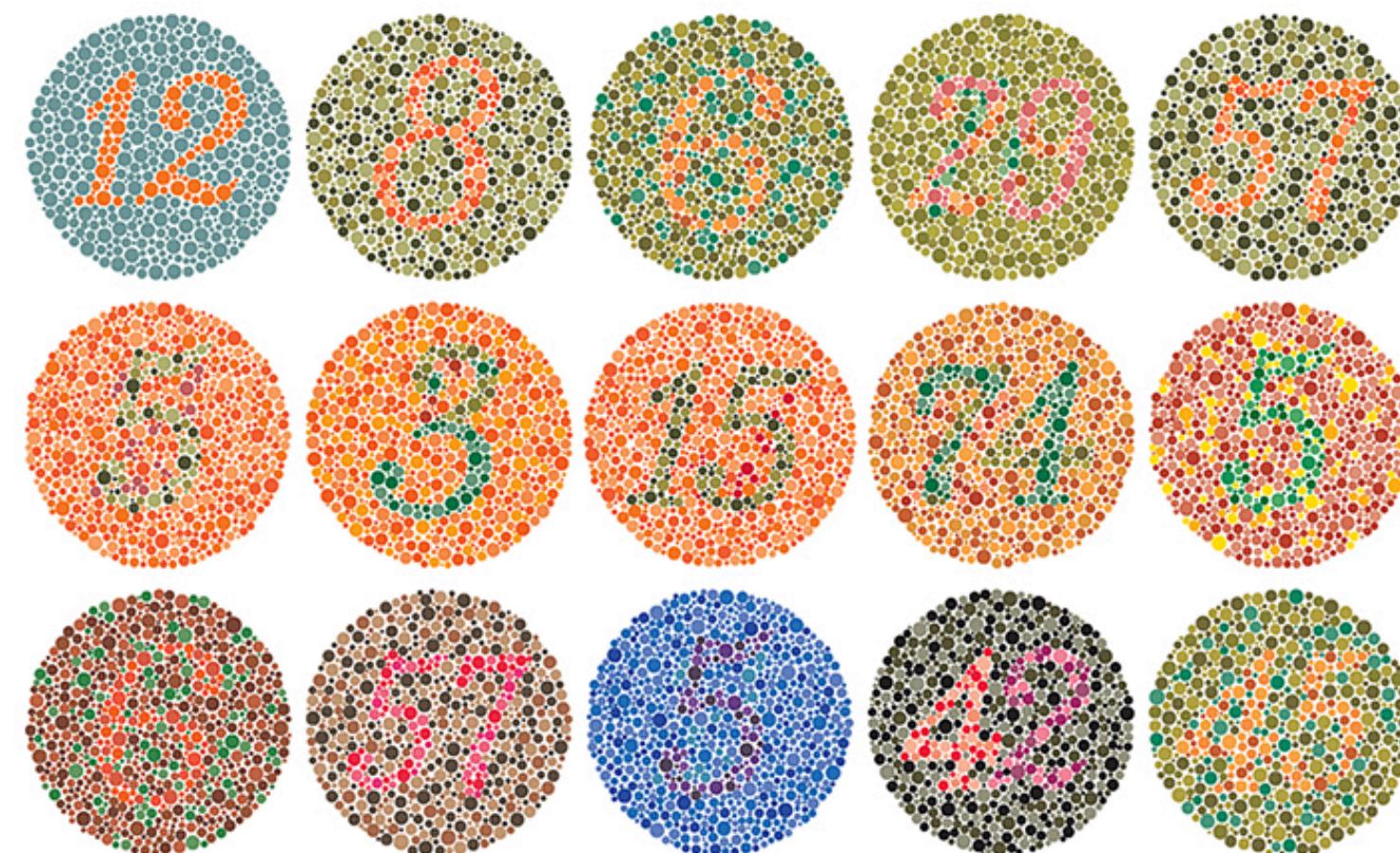
# Color Blindness

# Color Blindness

Deficiency in color vision, typically caused by faulty cone development

Often hereditary, caused by mutations on the OPN1LW, OPN1MW, and OPN1SW genes

These genes provide instructions for making the photopigment called “opsin”



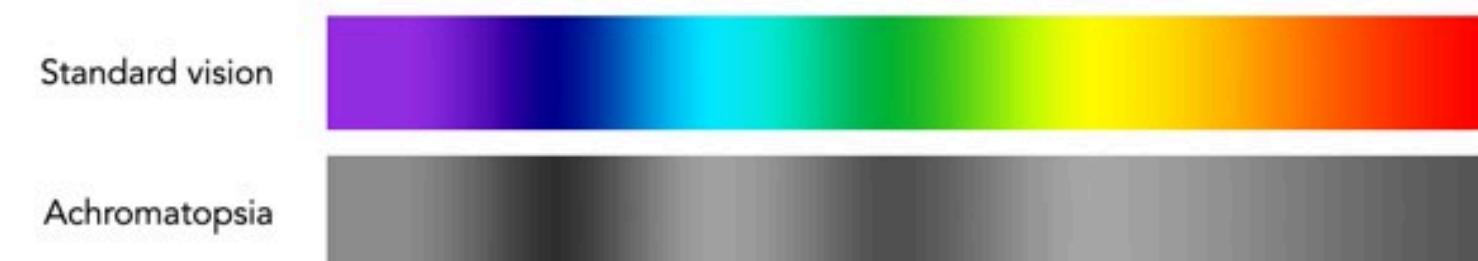
# Monochromacy

1-dimensional color vision (total colorblindness)

2 or 3 cone pigments are missing

Two types:

- Rod monochromacy (**achromatopsia**)
  - All cones are missing or non-functional
- Blue-cone (**S-cone**) monochromacy
  - Only the blue cones (S-cones) are functional



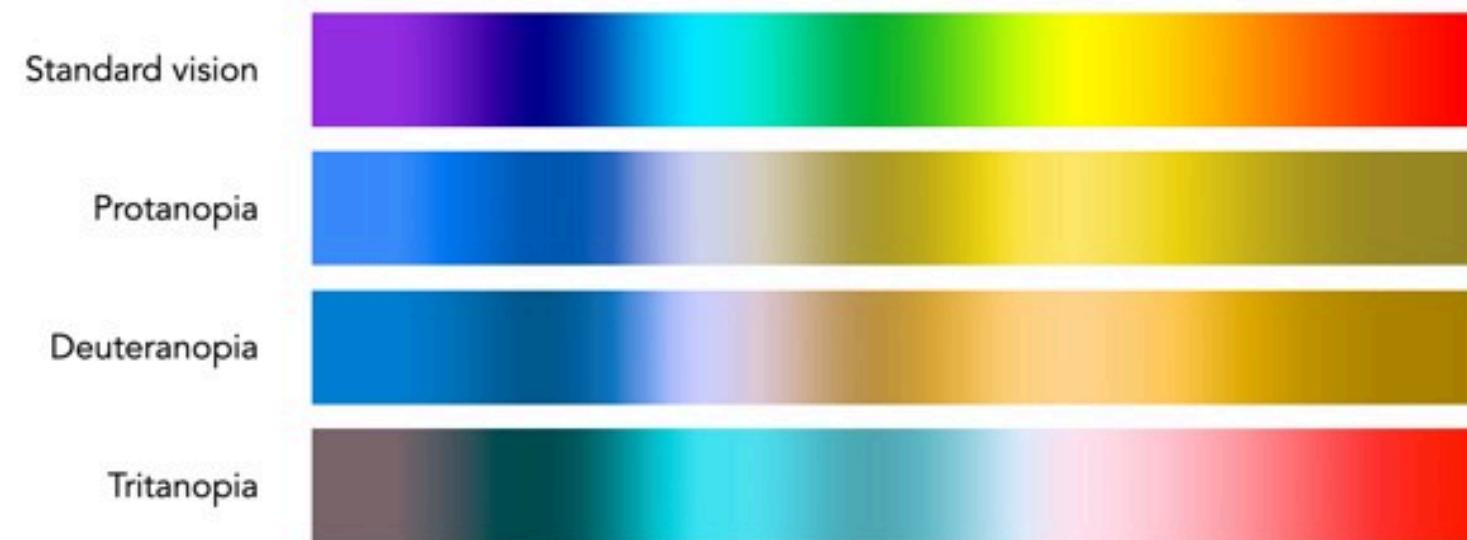
# Dichromacy

2-dimensional color vision

1 cone pigment is missing

Three types:

- **Protanopia:** Absence of Red receptors
- **Deuteranopia:** Absence of Green receptors
- **Tritanopia:** Absence of Blue receptors



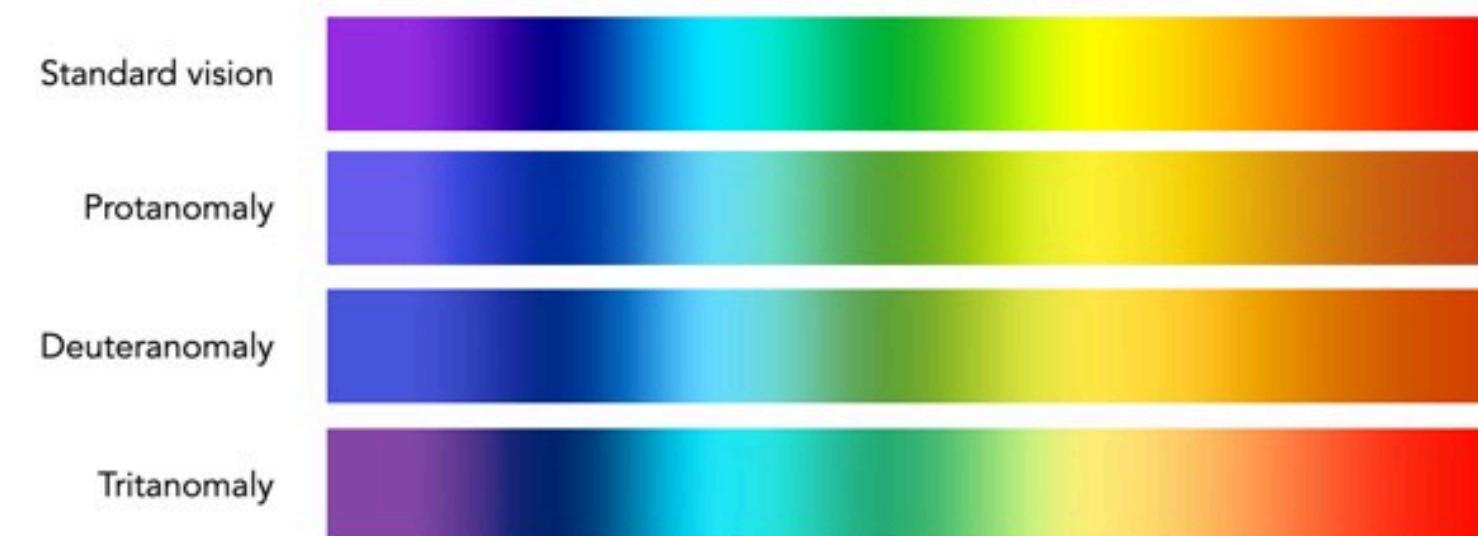
# Trichomacy

3-dimensional (typical) color vision

Sometimes, one cone may be altered, causing a slight impairment rather than a loss of color vision

Three types:

- **Protanomaly:** shift in red receptors
- **Deuteranomaly:** shift in green receptors (most common)
- **Tritanomaly:** shift in blue receptors



# Colorblind Web Page Filter

What are color blind anomalies? ⓘ

Please indicate a resource to be viewed, and a color filter to be applied to that resource.

Type a URL:  
<https://www.toptal.com/designers/colorfilter/exar>

**Protanopia**  
red/green color blindness; anomalous red cones

**Deuteranopia**  
red/green color blindness; anomalous green cones

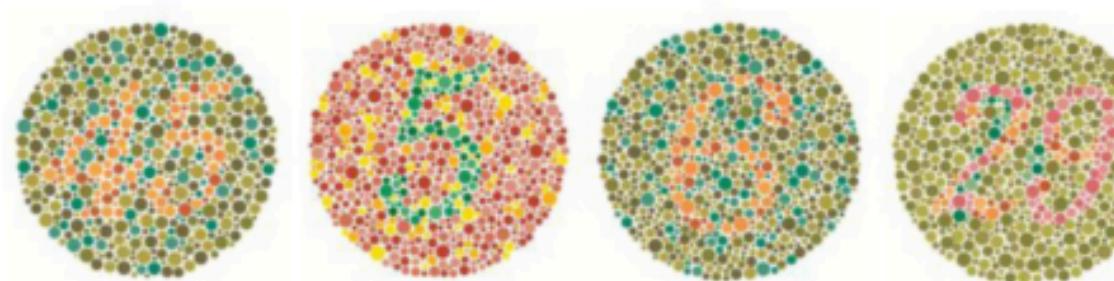
**Tritanopia**  
blue/yellow color blindness; anomalous blue cones

**Greyscale/achromatopsia**  
quick check for all forms of colorblindness

**FETCH AND FILTER!**

**Example page**

Type your own URL at the top form to see it color-blind-filtered (at the right side).

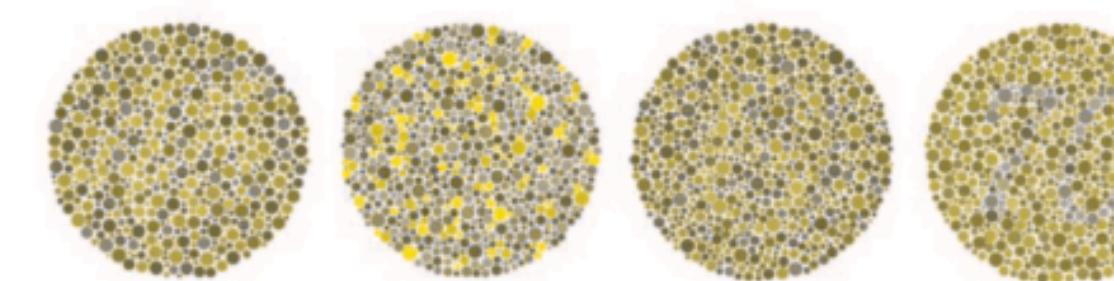


This visual perception test is known as an Ishihara test and has been used since 1917. You can read more at [Wikipedia](#).

Set of colors unambiguous to color vision deficient  
and to normal sighted persons

Original color	Seen by a...	HUE	COLOR CODE	
	Protan	Deutan	Tritan	Black, 0° #000000; RVB 0,0,0 CMJN % 0,0,0,100.
				Orange, 41° #E69F00; RVB 230,159,0 CMJN % 15,41,93,1.

Type your own URL at the top form to see it color-blind-filtered (at the right side).



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				Orange, 41° #E69F00; RVB 230,159,0 CMJN % 15,41,93,1.

Even if you aren't colorblind, someone viewing your visualizations may be

**Design with colorblindness in mind by varying hue, saturation, and luminance, using monochrome color schemes, and adding visual cues that don't just rely on color**

# A Note on Accessible Visualization Design

# Color Blindness is NOT the only disability

Data visualization research has historically prioritized designing for color blindness

Approximately 8.4% of white men have some form of color-blindness, compared to significantly lower percentages among various non-white-men (Garth 1933 \*\*\*)

Hence, the research has historically prioritized designing for white men

# Other disabilities to consider when designing

## Low Vision:

- Use high contrast text and marks
- Add options for magnification/zoom
- Use annotations and guides

## Functional/Motor Impairment:

- Consider UI alternatives to interactions
- Try Scrollytelling
- Provide keyboard-based interactions

# Other disabilities to consider when designing

## Cognitive Disabilities:

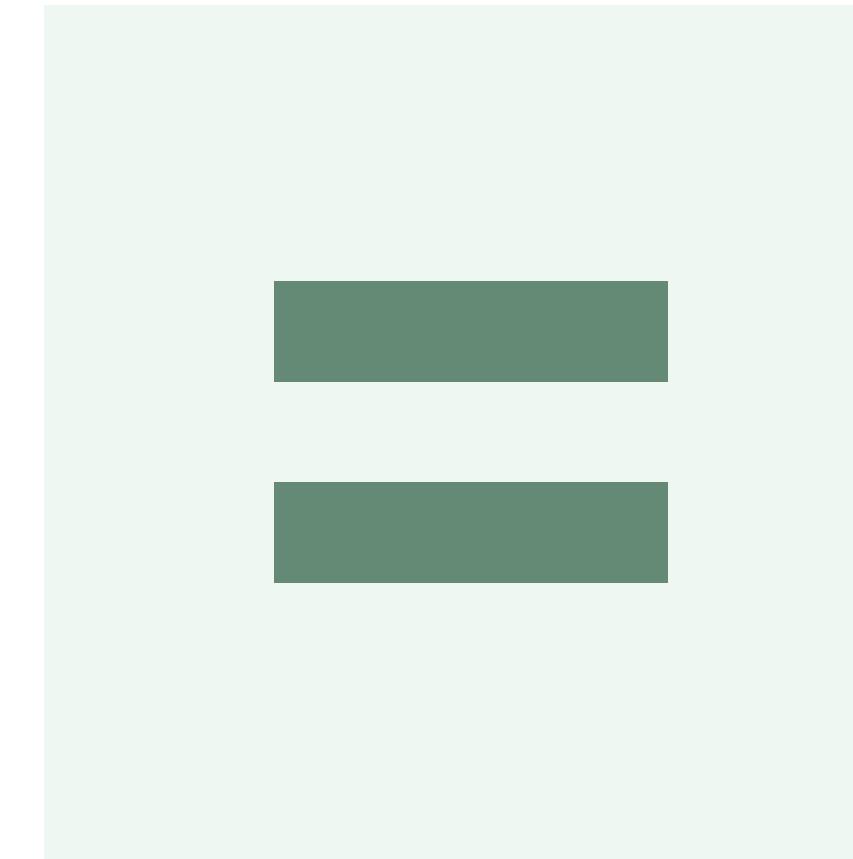
- Use captions, summaries, clear titles, & plaintext alternatives
- Reduce visual complexity
- Use assistive design (how-to-read guides, help)

## Attentive Deficit-Hyperactive Disorder (ADHD):

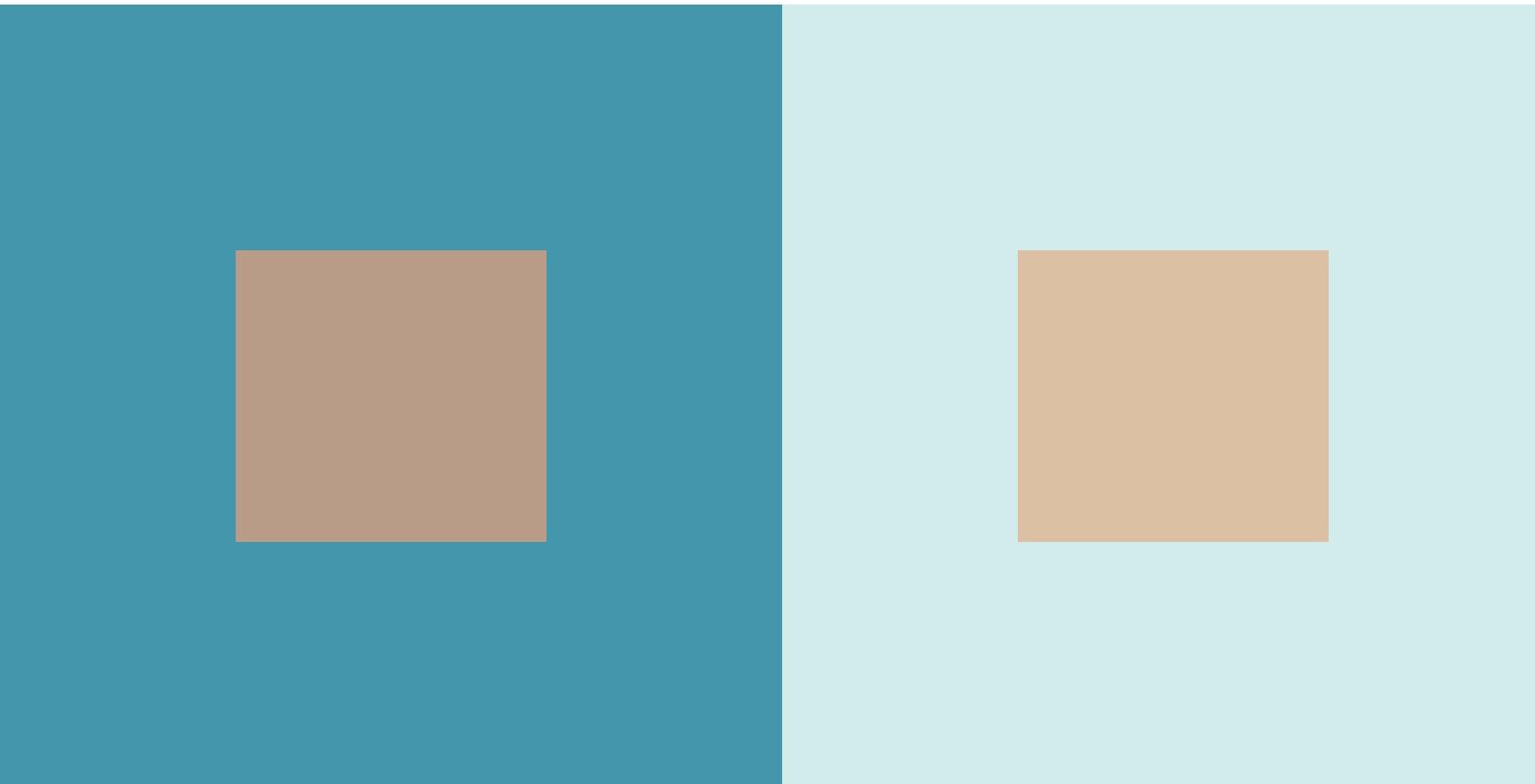
- Use clear and concise text summaries
- Consider motion design and animation
- Add interaction history

# Other Important Features of Color Perception

# Color Relativity



# Color Relativity



# Color Relativity



We have a strong propensity to assume our judgments of color are absolute, when they are actually relative to a specific context

**Use color sparingly to avoid weird relative visual effects**

# Luminance Contrast

# Luminance Contrast

Showing small blue text on a black background is a bad idea.  
There is insufficient luminance contrast

Showing small blue text on a black background is a bad idea.  
There is insufficient luminance contrast

Showing small blue text on a black background is a bad idea.  
There is insufficient luminance contrast

Showing small yellow text on a white background is a bad idea.  
There is insufficient luminance contrast

# Interactions between Color and Size



“the smaller the mark, the less distinguishable the color”

-Jacques Bertin

# General Guidelines for Color Usage

Color is a relative medium - Use a solid, neutral background

Text-background luminance ratio - 3:1 minimum (10:1 ideal)

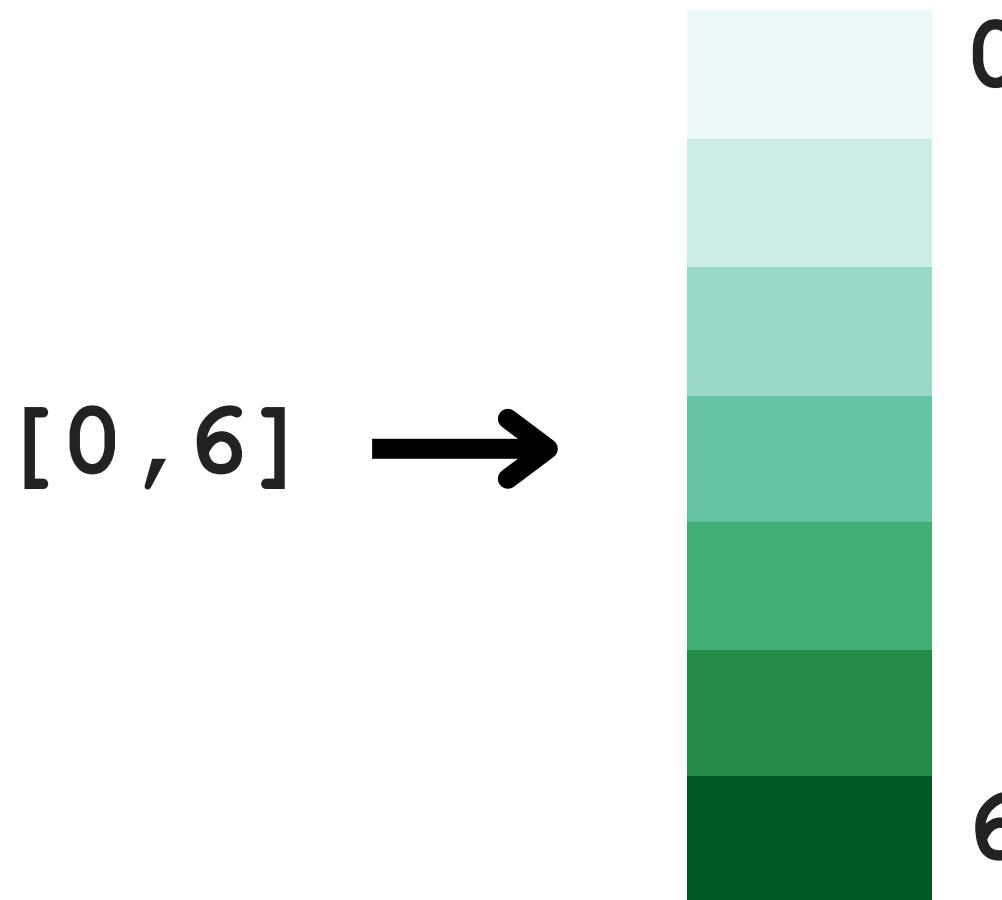
In small regions, use bright, highly-saturated colors

Low saturation, pastel colors can be used in large regions and backgrounds

# Colormaps

# What Is a Colormap?

Specifies a mapping between colors and numerical values  
(sometimes called a transfer function)

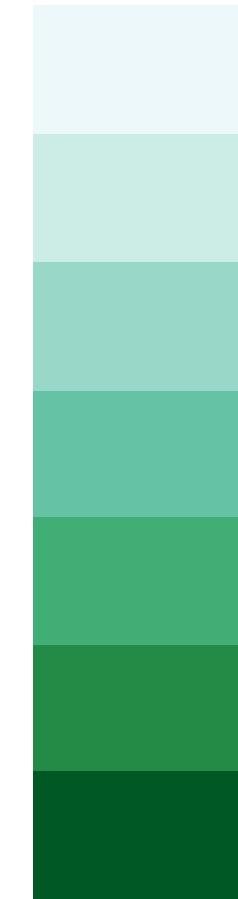
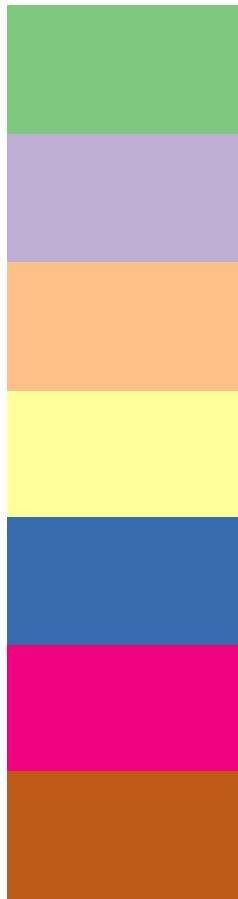


# Types of Colormaps

Categorical

vs.

Ordered

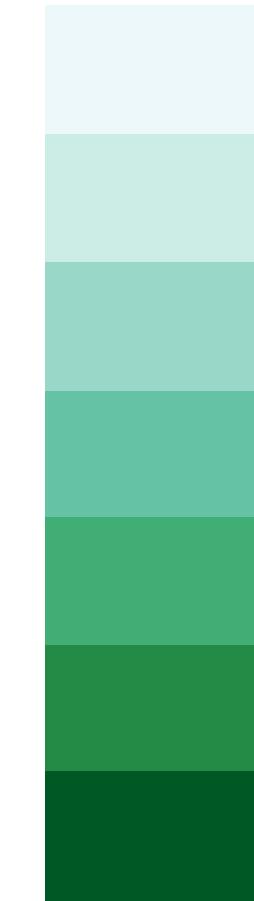
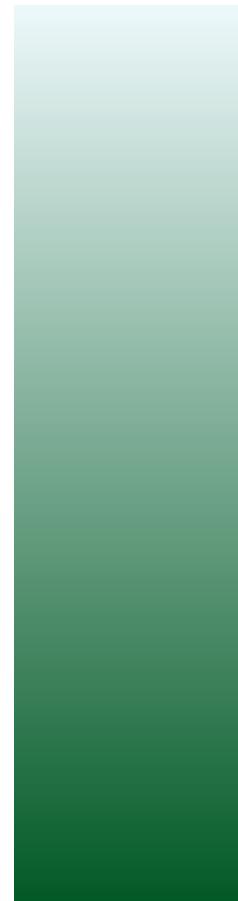


# Types of Colormaps

Continuous

vs.

Segmented

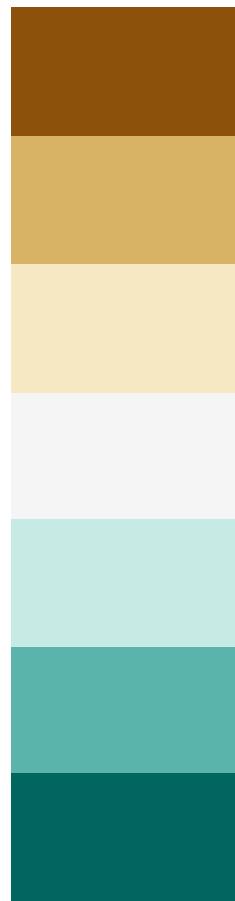


# Types of Colormaps

Diverging

vs.

Sequential

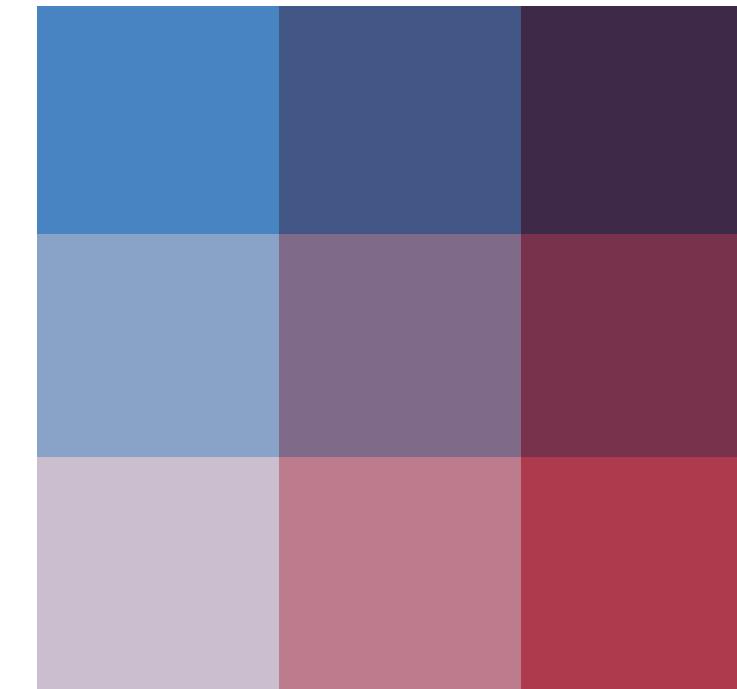
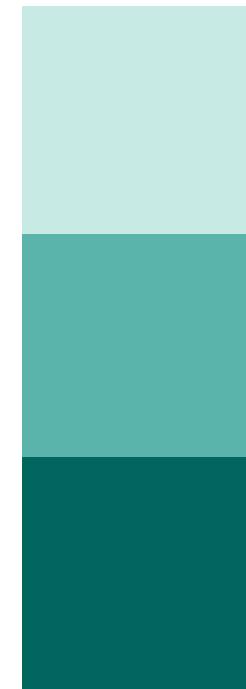


# Types of Colormaps

Univariate

vs.

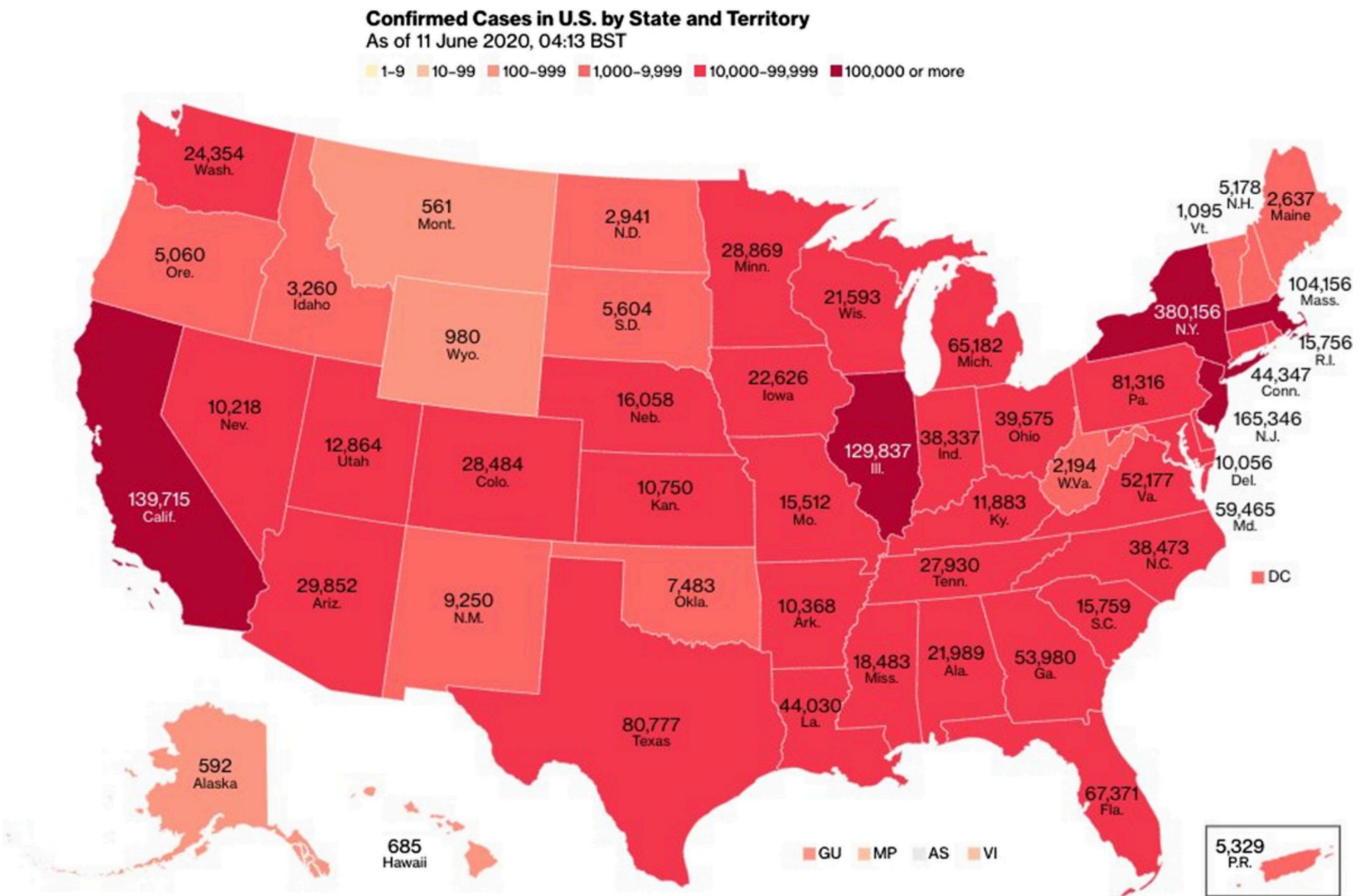
Bivariate



Bivariate colormaps can be difficult to interpret

# Colormaps are Expressive

Match your colormap  
to attribute type  
characteristics



# Hues for Categories

Let's say you have a dataset with carbon dioxide measurements in four different biomes



Mountain



Ocean



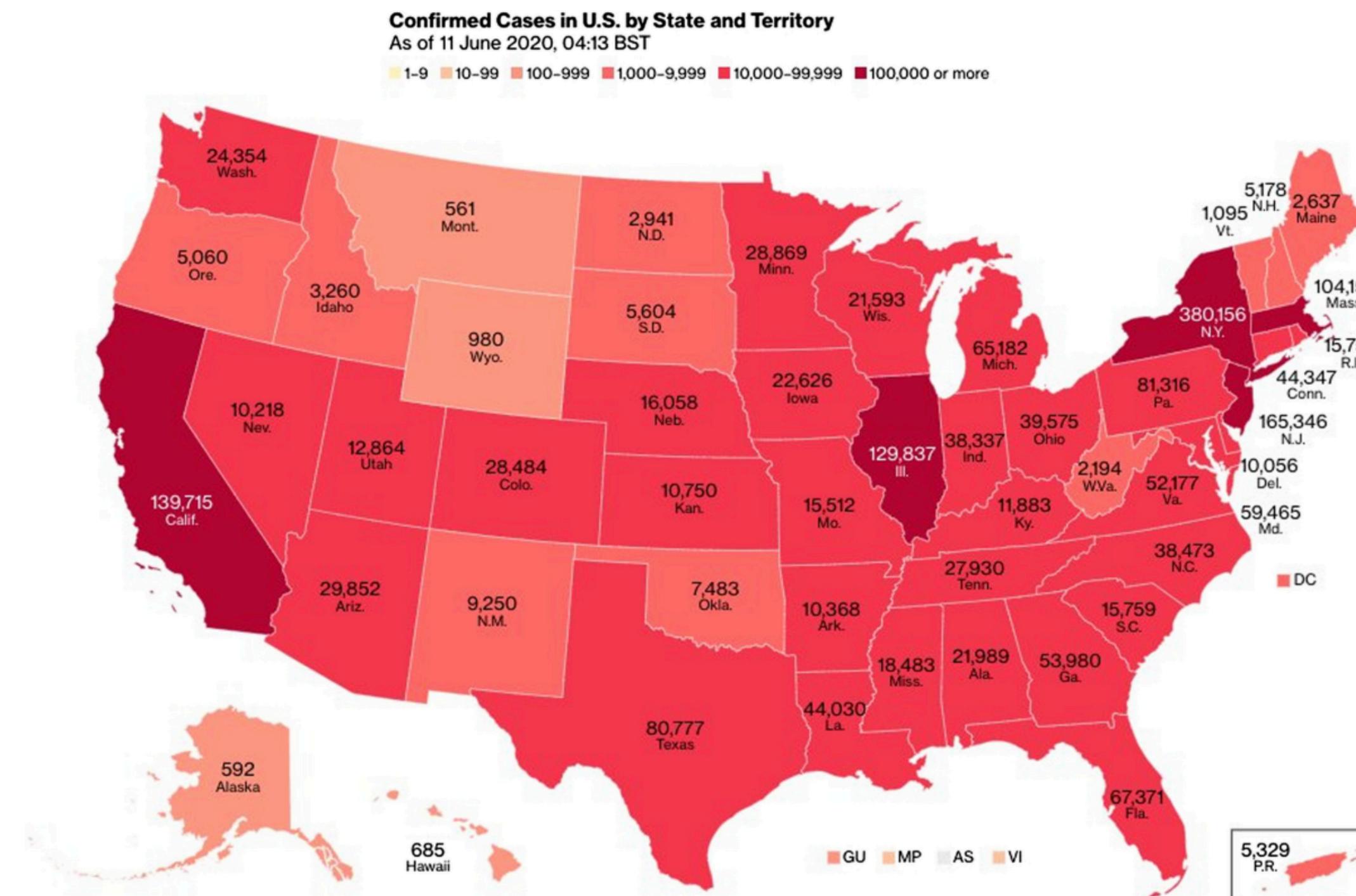
Rainforest



Desert

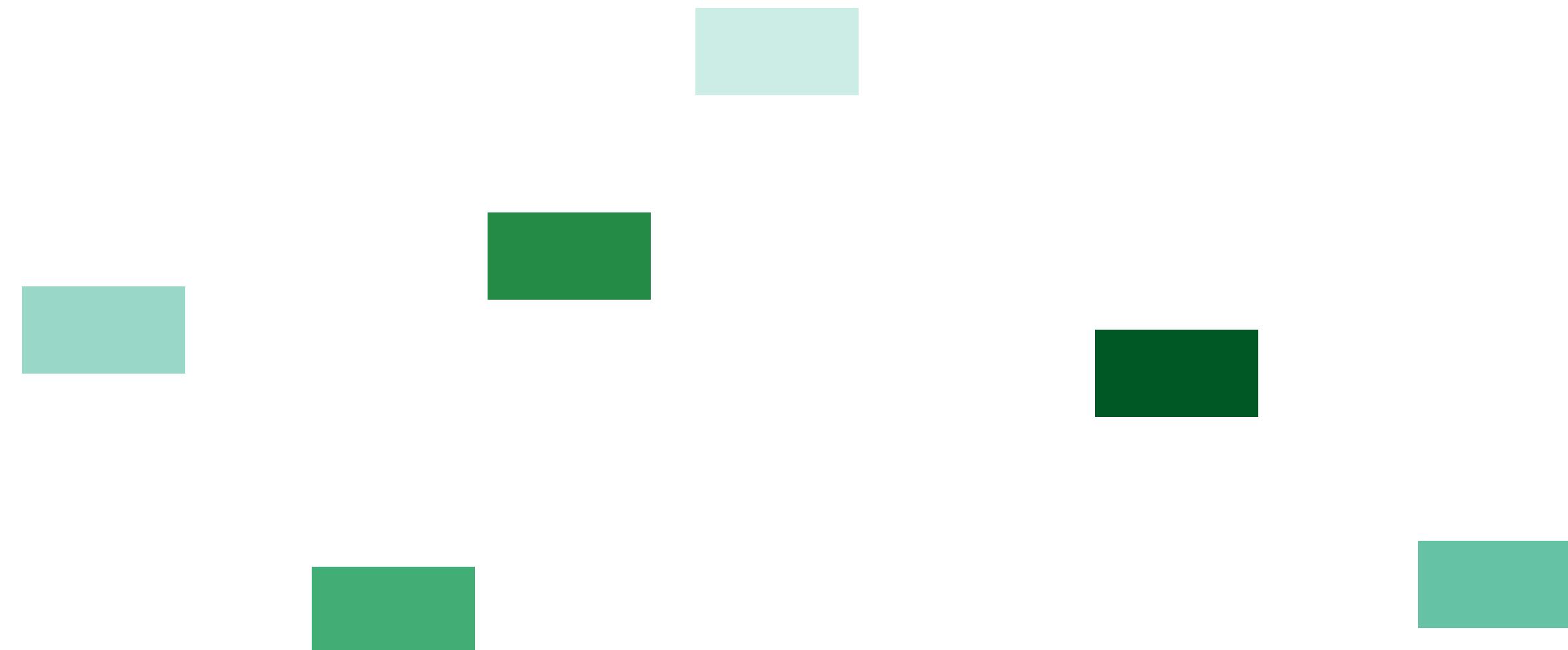
Be careful when you have more categories, we are only good at distinguishing about 6 to 12 colors simultaneously.

# Ordinal Data - Use Saturation or Luminance

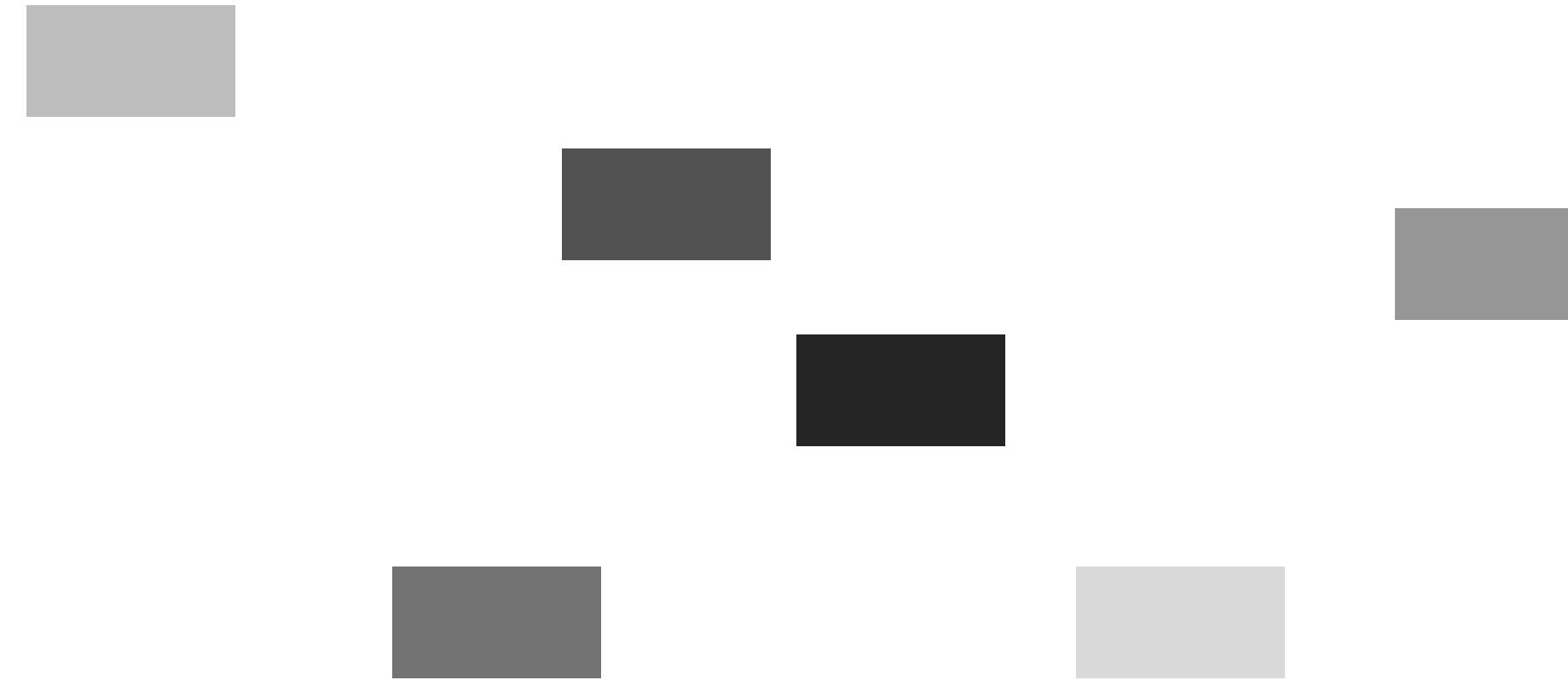


Note: State figures may not reflect repatriated patients from the Diamond Princess cruise ship or those evacuated from Wuhan, China.

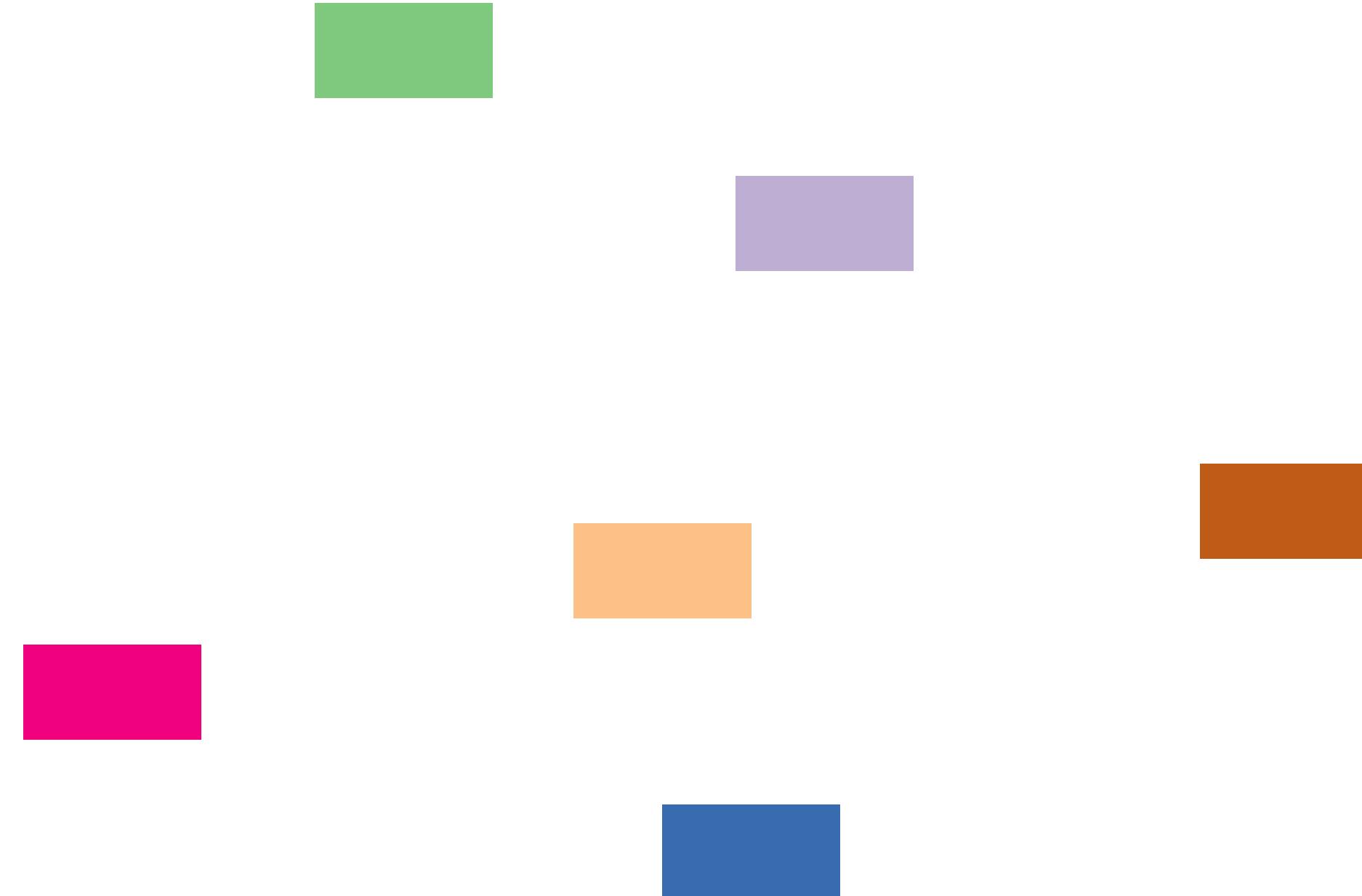
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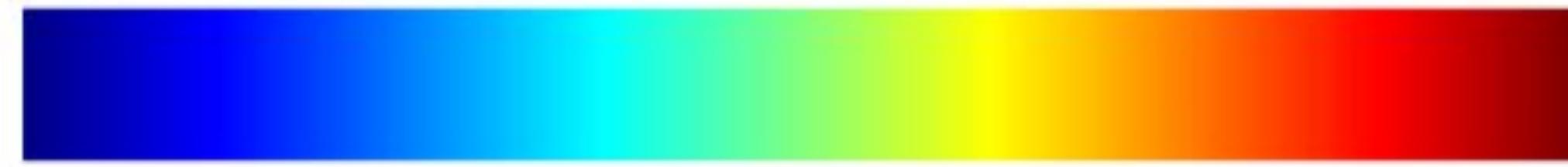
# Saturation or Luminance for Ordered Data



# Ordinal Data - Use Saturation or Luminance

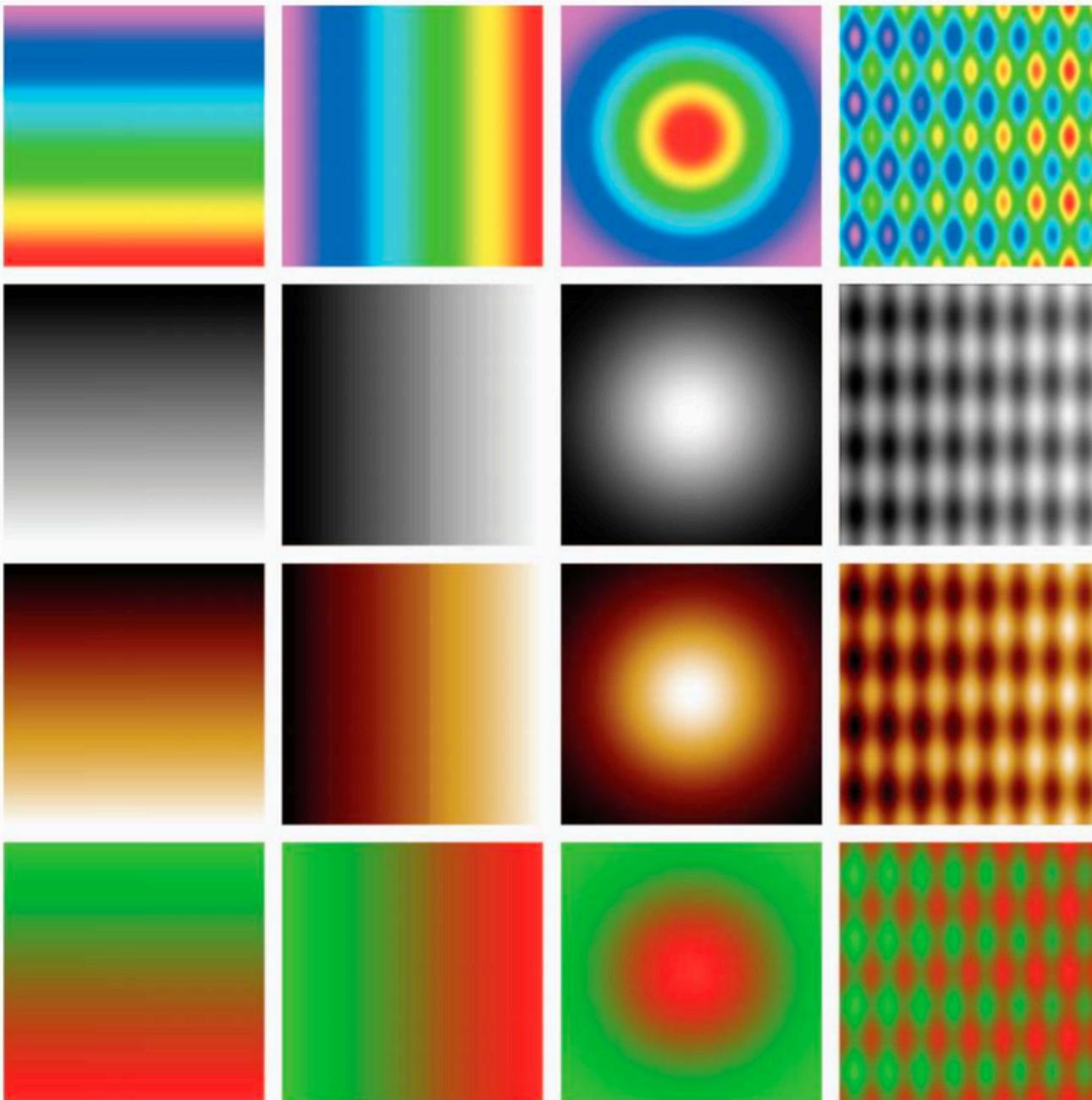


# Rainbow Colormaps



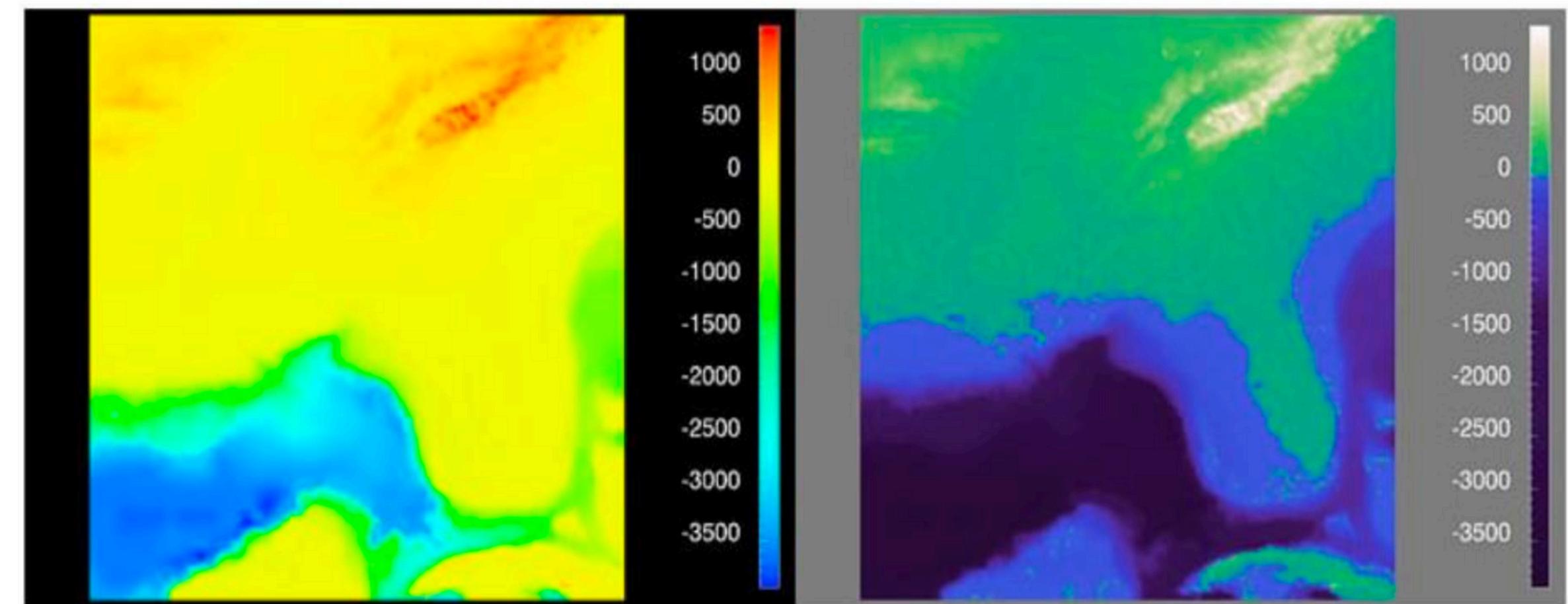
# Rainbow Colormaps: Challenges

The luminance of rainbow colormaps is not uniform



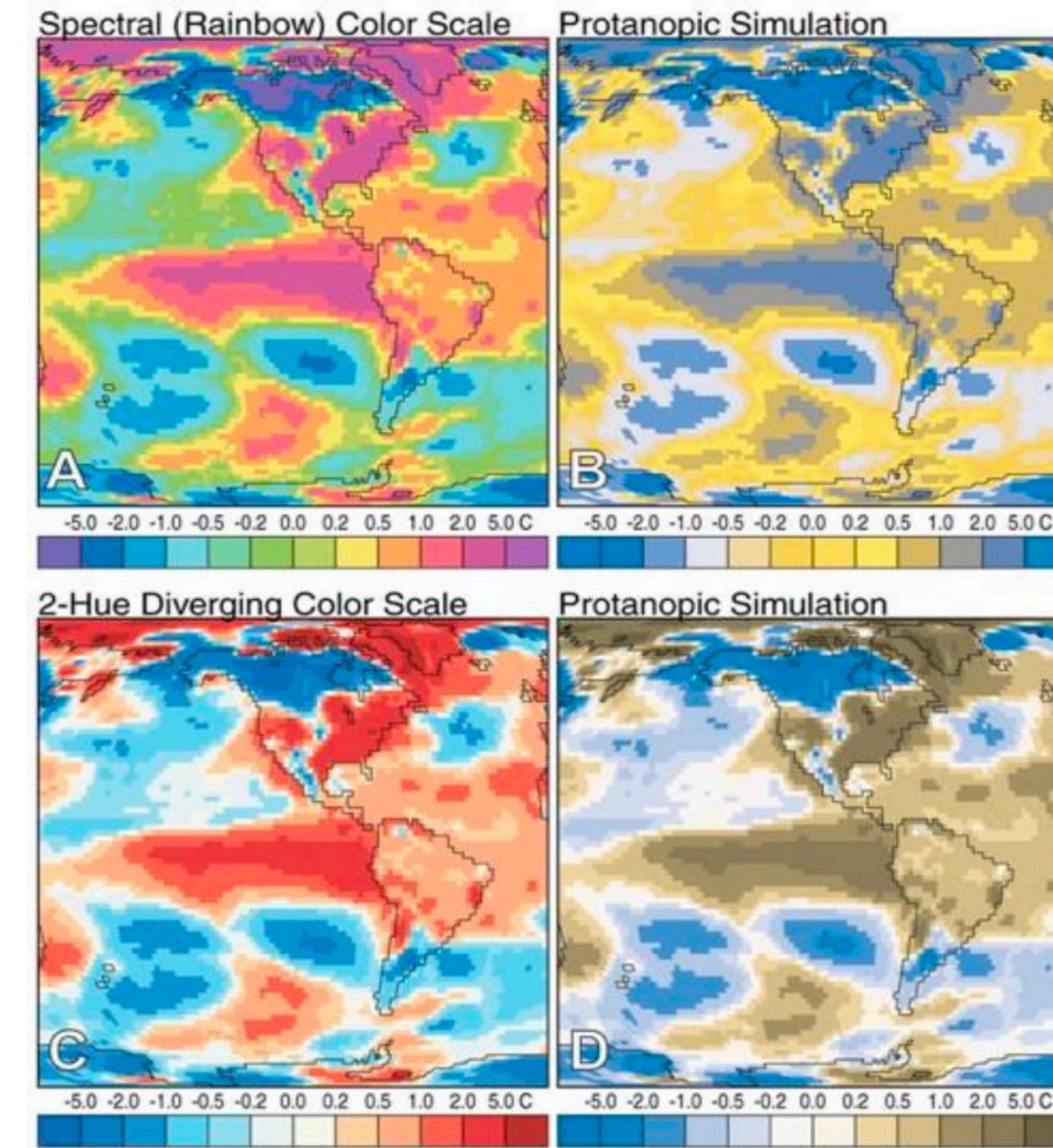
# Rainbow Colormaps: Challenges

Since rainbow colormaps are continuous, visual borders can be difficult to distinguish



# Rainbow Colormaps: Challenges

Rainbow colormaps are strongly affected by colorblindness since they use the entire color spectrum



## Blog

Blog 2024 &gt;

Blog 2023 &gt;

Rainbow Colormaps Are Not All Bad (Paper)

Paper: Notebooks for Data Analysis and Visualization

Course on Data Vis Fundamentals and Best Practices

New video: Exploring the connections between companies with They Rule

Blog 2022 &gt;

Blog 2021 &gt;

Blog 2020 &gt;

Blog 2019 &gt;

Blog 2018 &gt;

Blog 2017 &gt;

Blog 2016 &gt;

Blog 2015 &gt;

Blog 2014 &gt;

Blog 2013 &gt;

Blog 2012 &gt;

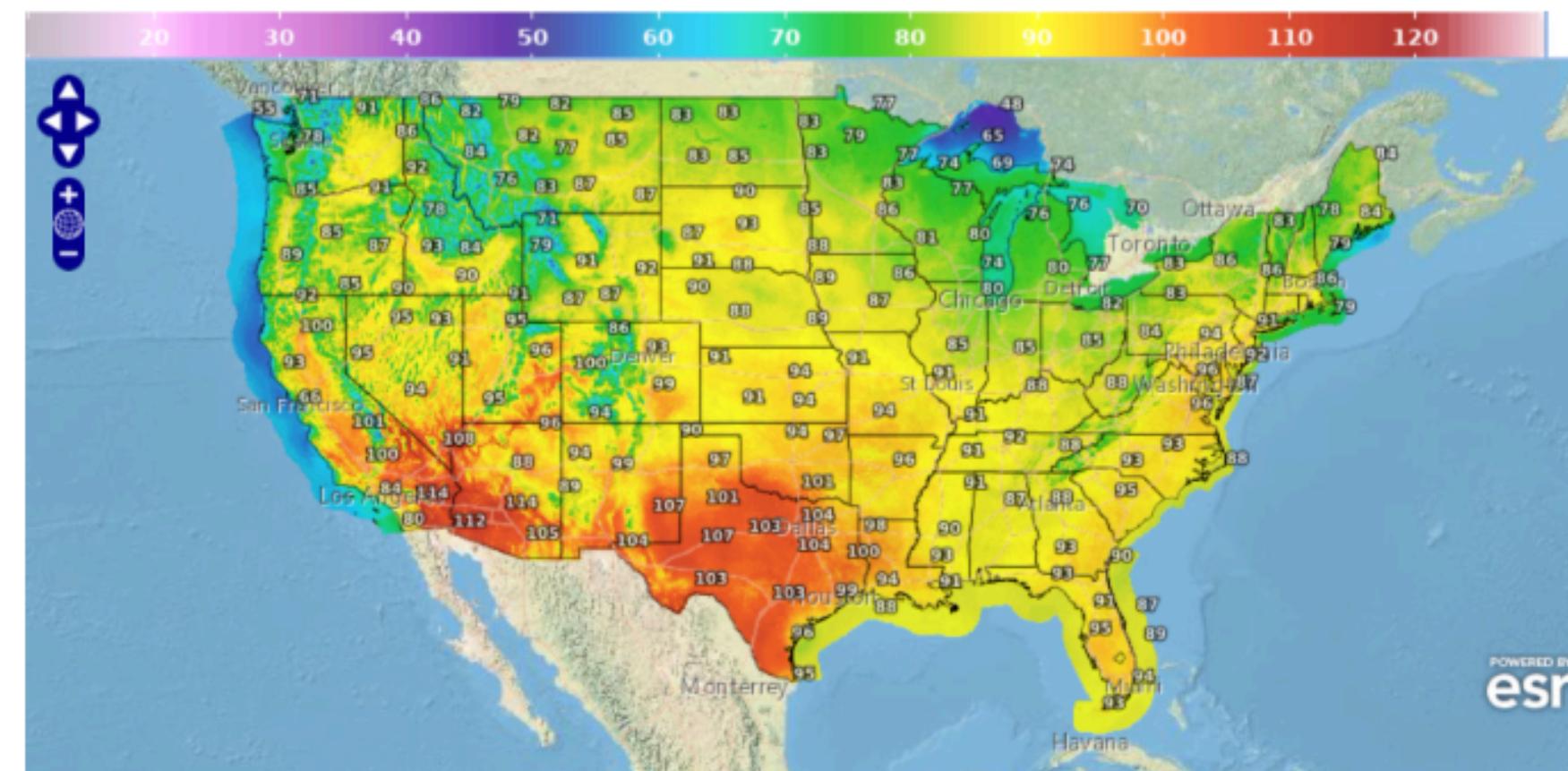
Blog 2011 &gt;

Blog 2010 &gt;

# Rainbow Colormaps Are Not All Bad (Paper)

Rainbow colormaps are among the most derided ideas in data visualization, second only to pie charts. And yet, people use them. Why? [A recent paper](#) looks at some of the reasons why they are so popular and points to research showing that they might not be so bad if used for the right tasks. There's even opportunity for interesting research in rainbow colormaps!

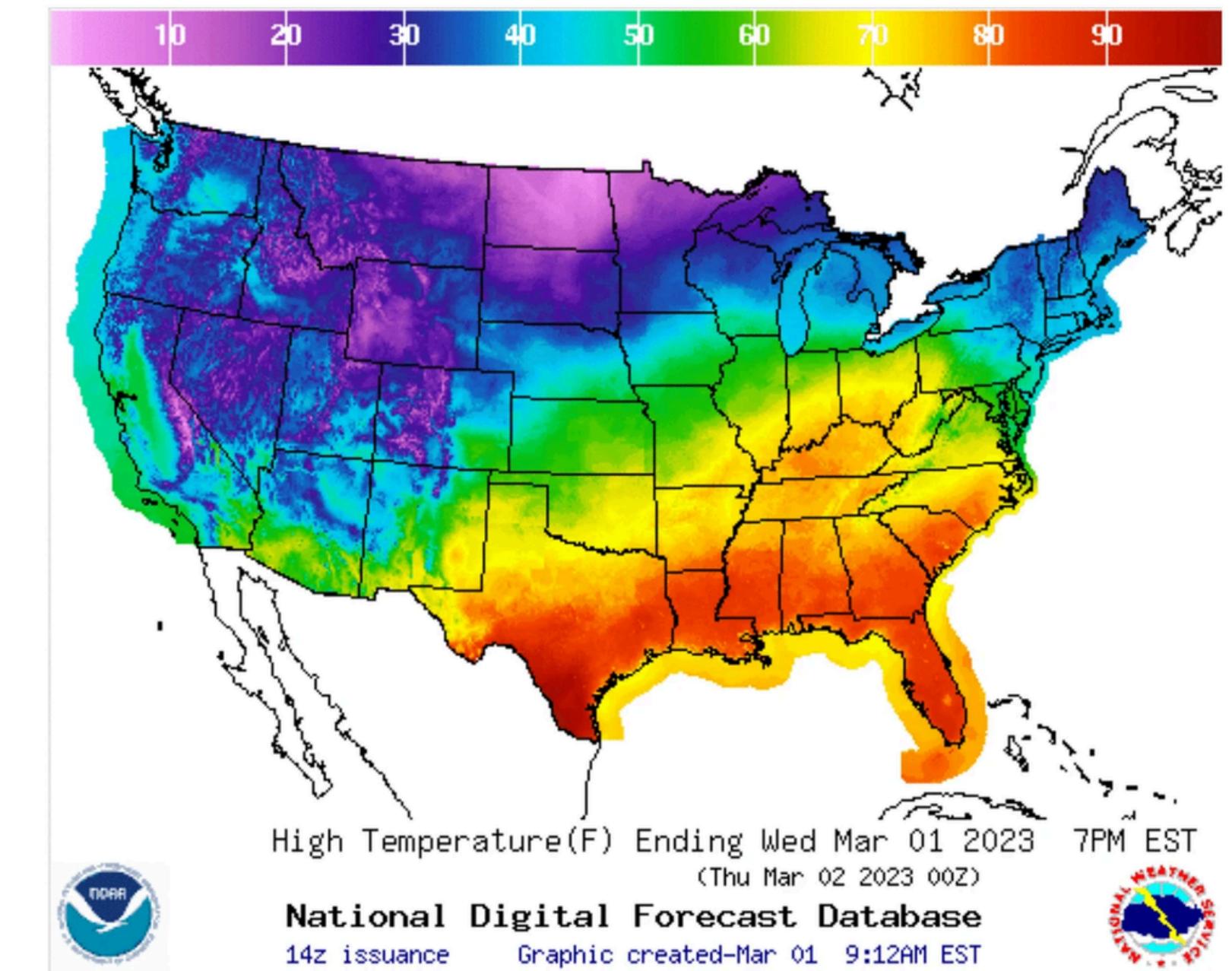
Finger-wagging about rainbow colormaps is a pretty common pastime in visualization. [I've done it too!](#) And it's not like there aren't good reasons. Look at this map of maximum temperatures in the US, [published by NOAA](#), for example:



The rainbow colormap used here has all the usual problems: it's not uniform in its luminance (brightness), different colors cover different ranges of the colormap (though it's usually green that is the worst, here it's purple and red), and of course the ordering is somewhat arbitrary.

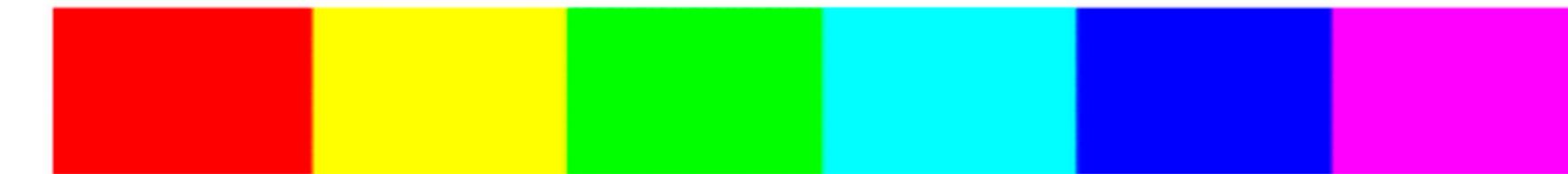
# Rainbow Colormaps: Guidelines

Consider your tasks - rainbow color maps are the most accurate when you want users to read a temperature value from a map using a key



# Rainbow Colormaps: Guidelines

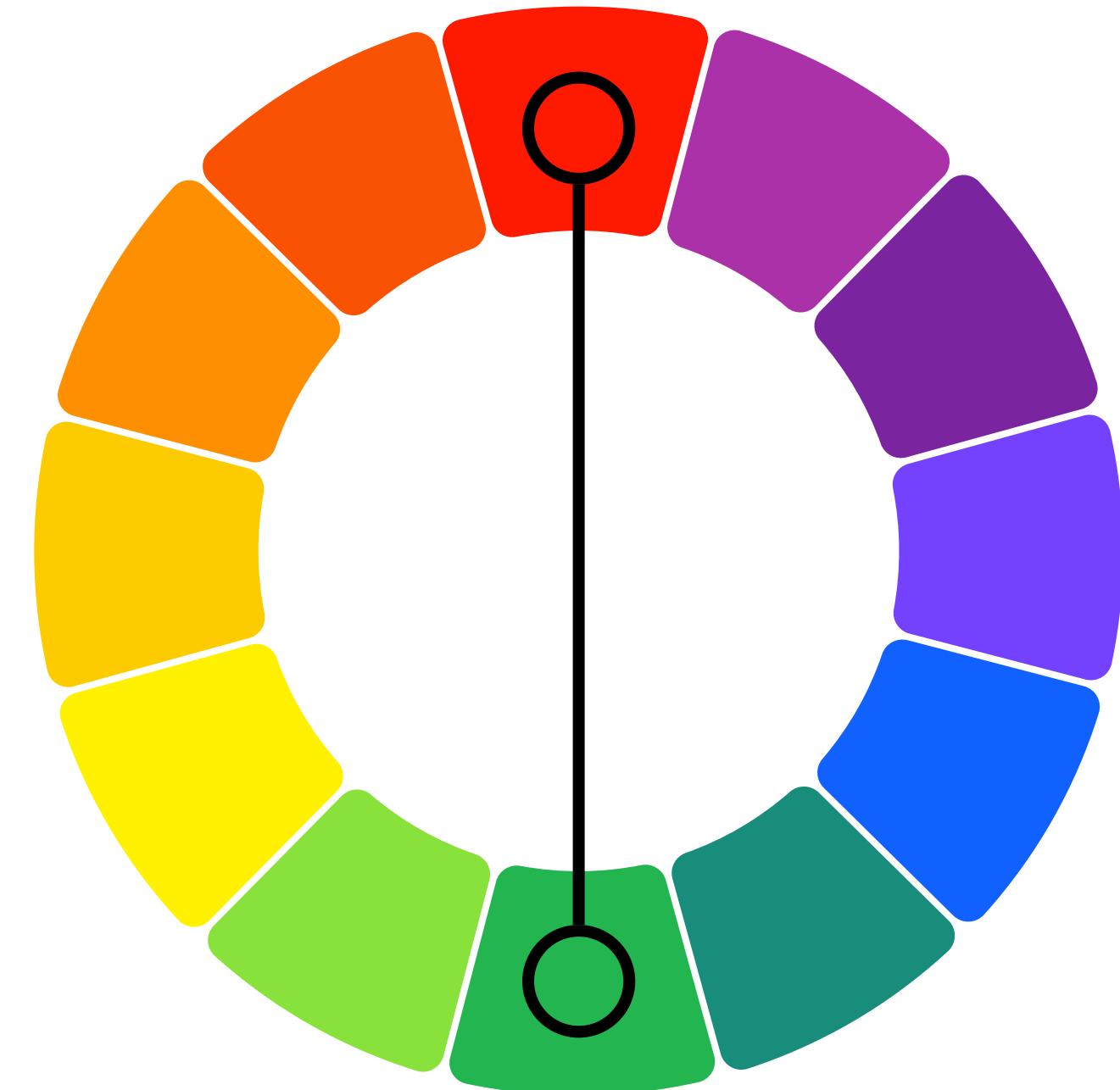
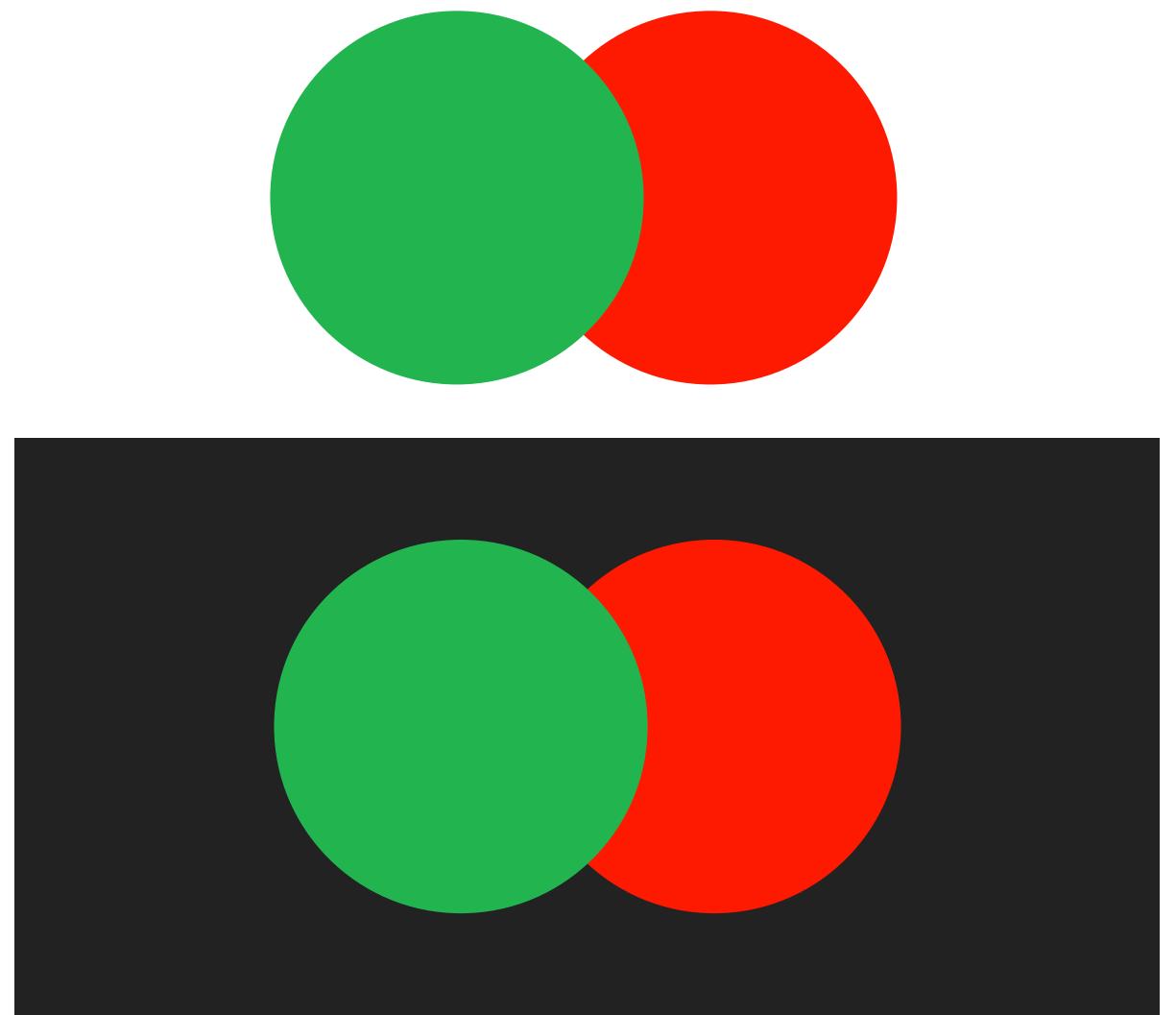
Consider lowering the saturation, or using a segmented rainbow colormap instead



# Color Schemes

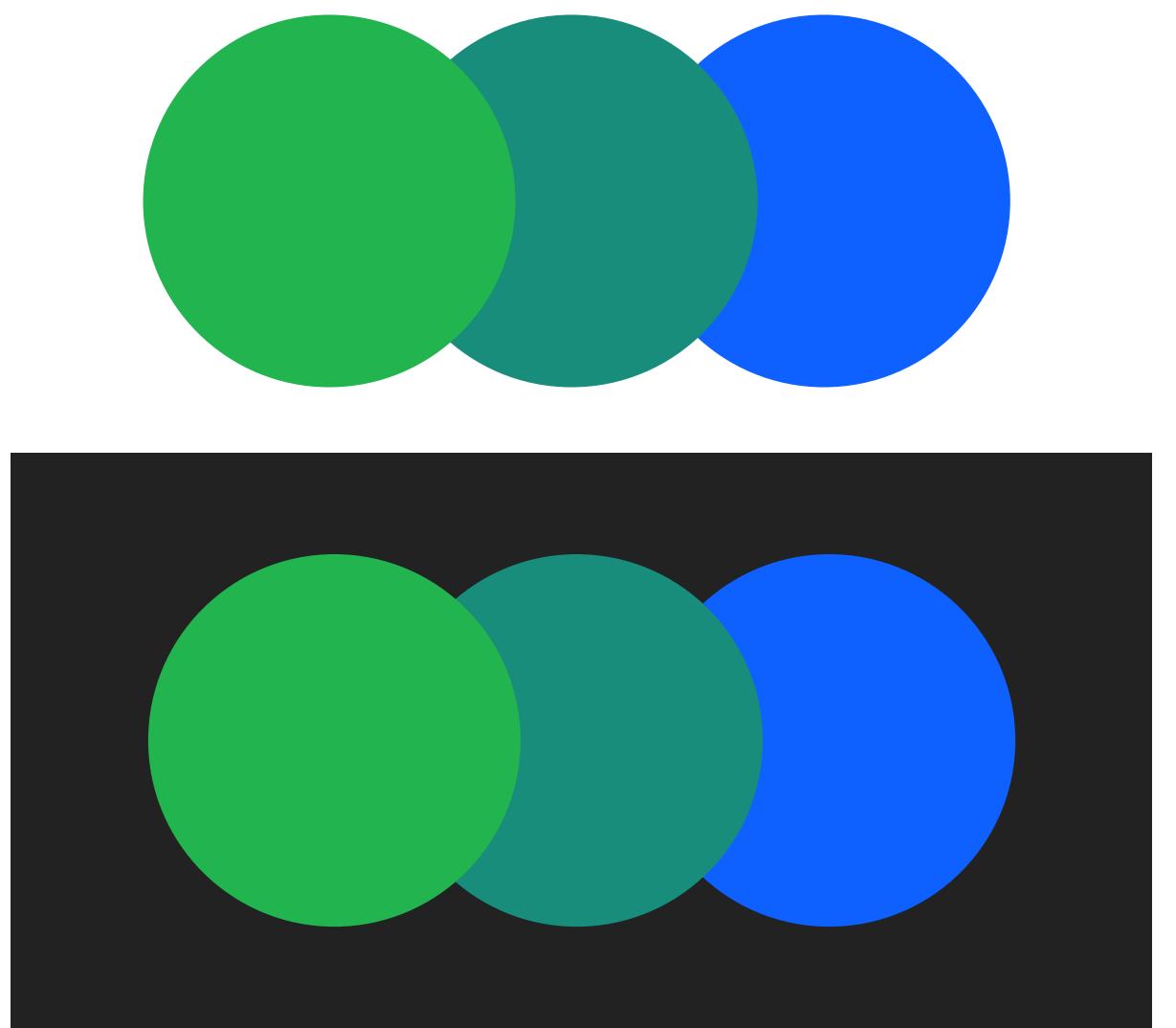
# Color Schemes: Complementary

High contrast for vibrant look



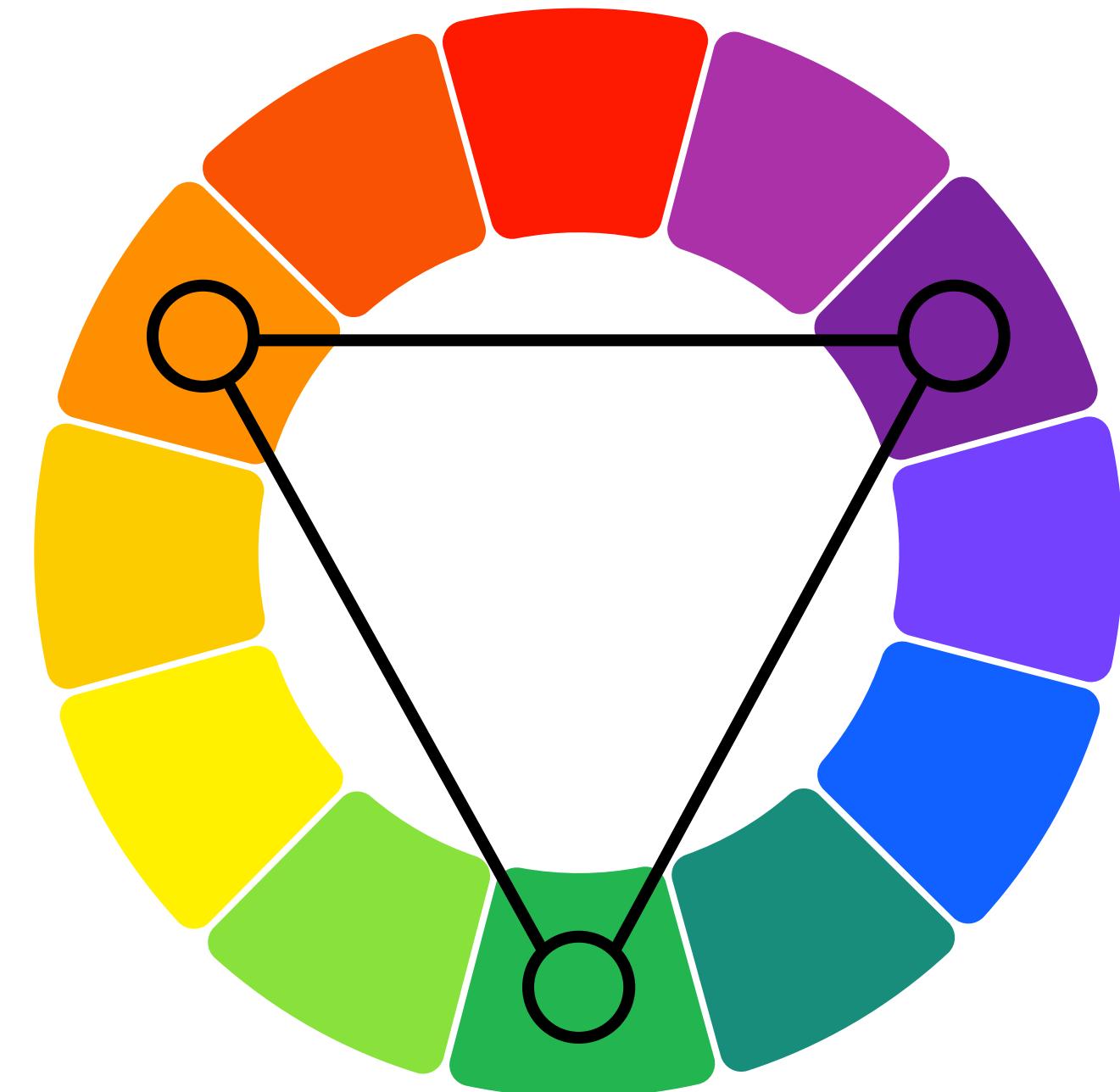
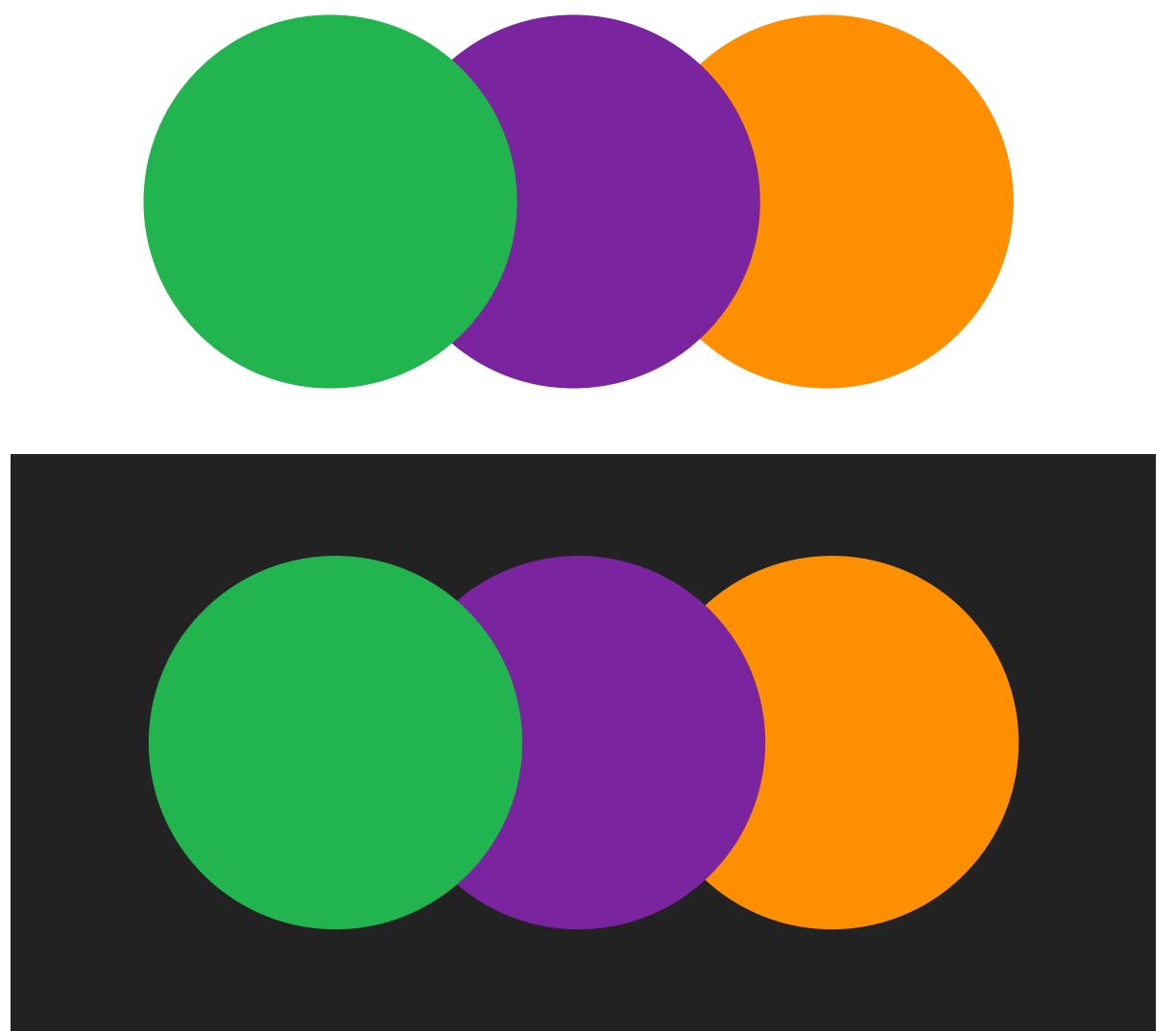
# Color Schemes: Analogous

Harmonious and pleasing to the eye - often found in nature



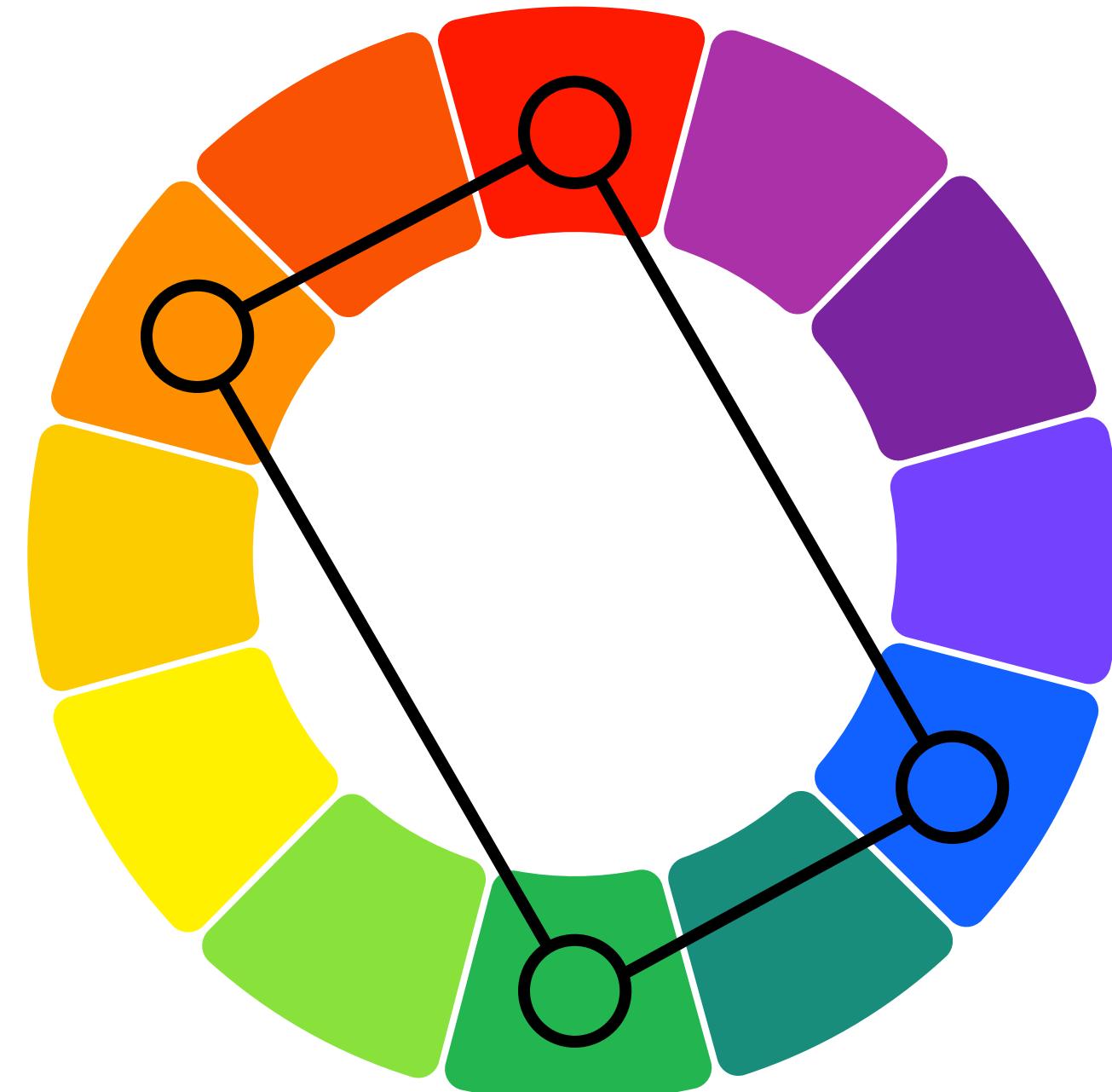
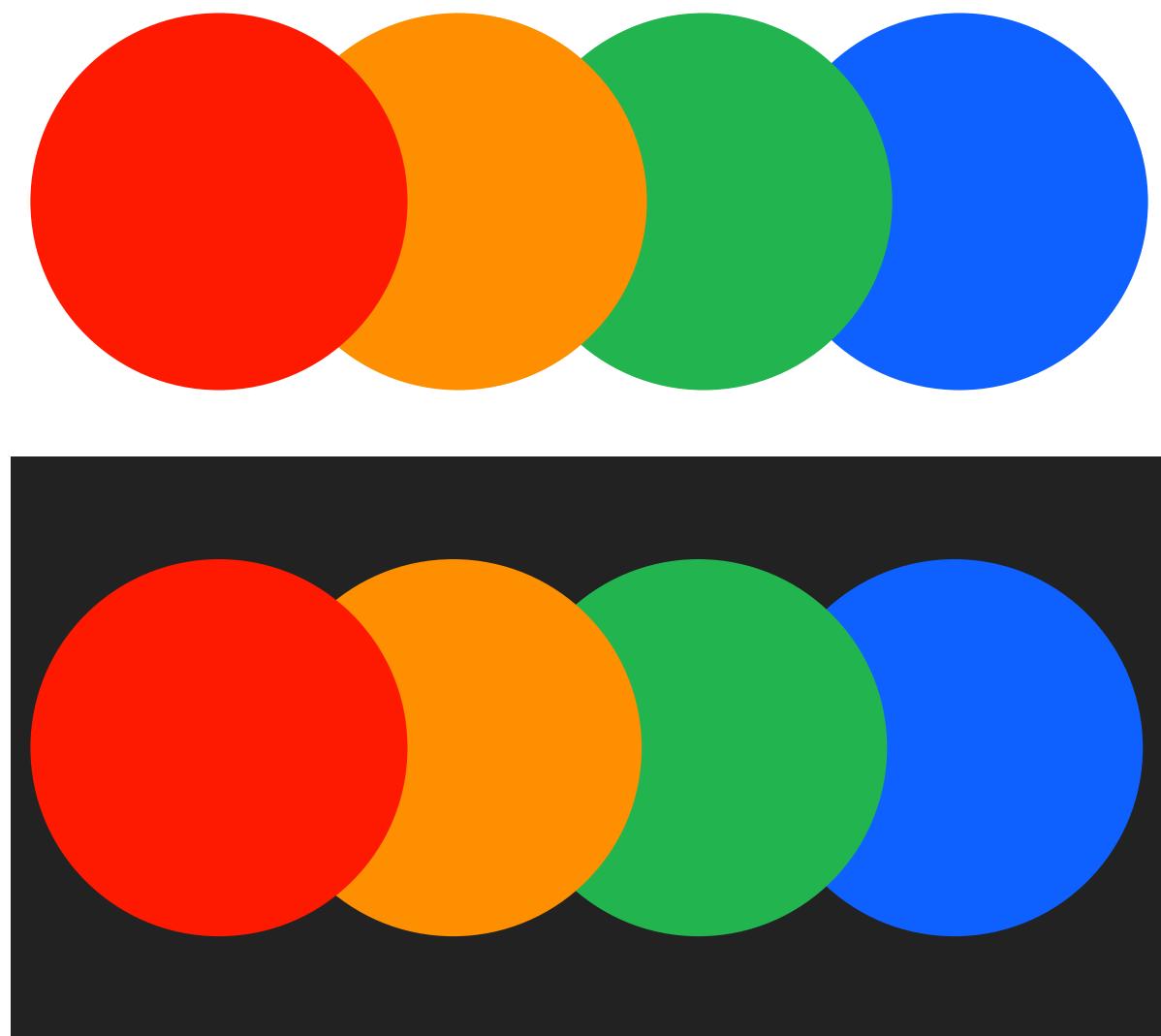
# Color Schemes: Triad

vibrant, even if you use pale or unsaturated versions of the hues



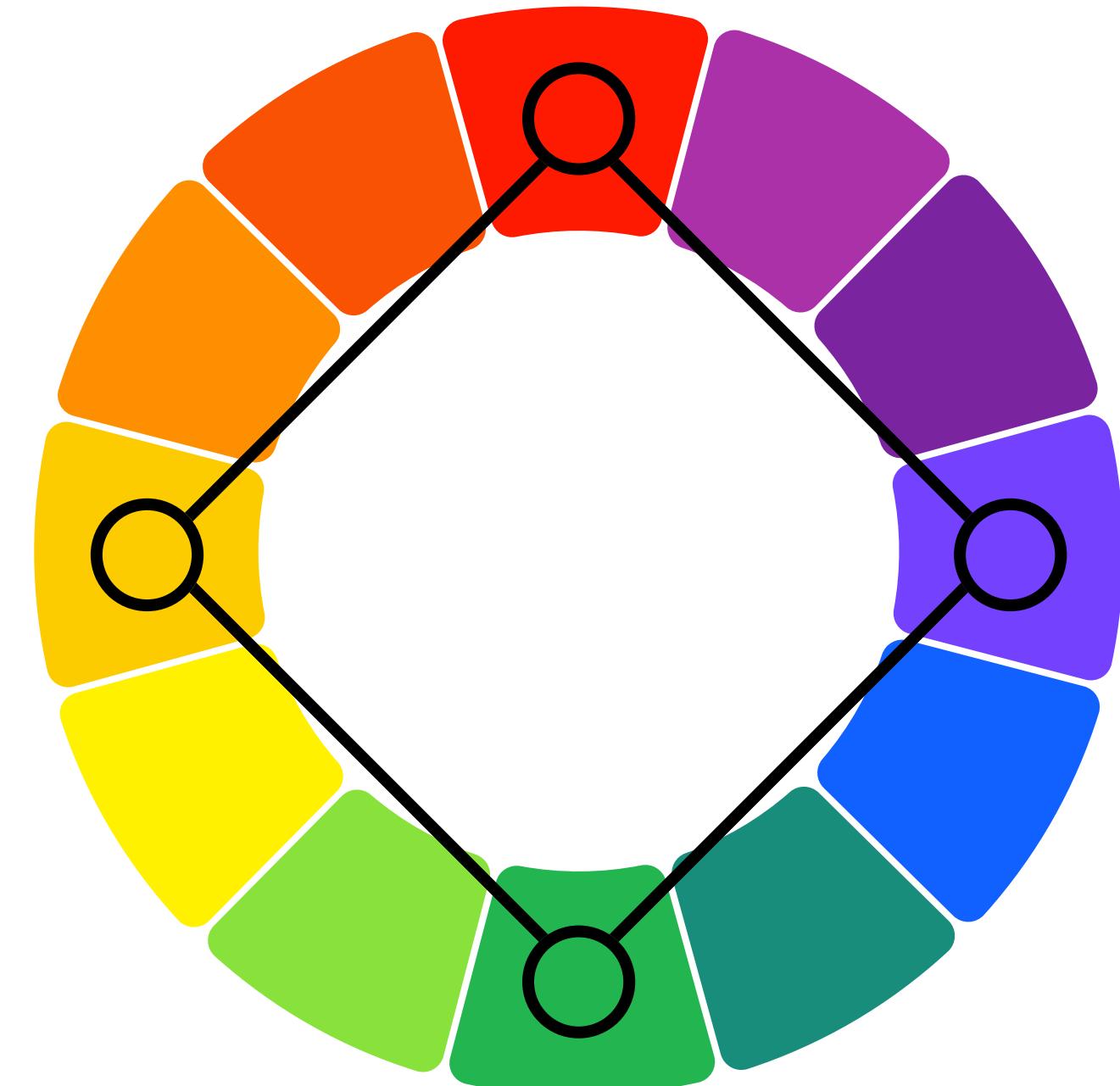
# Color Schemes: Split-Complementary

same strong contrast as  
complementary, but less tension



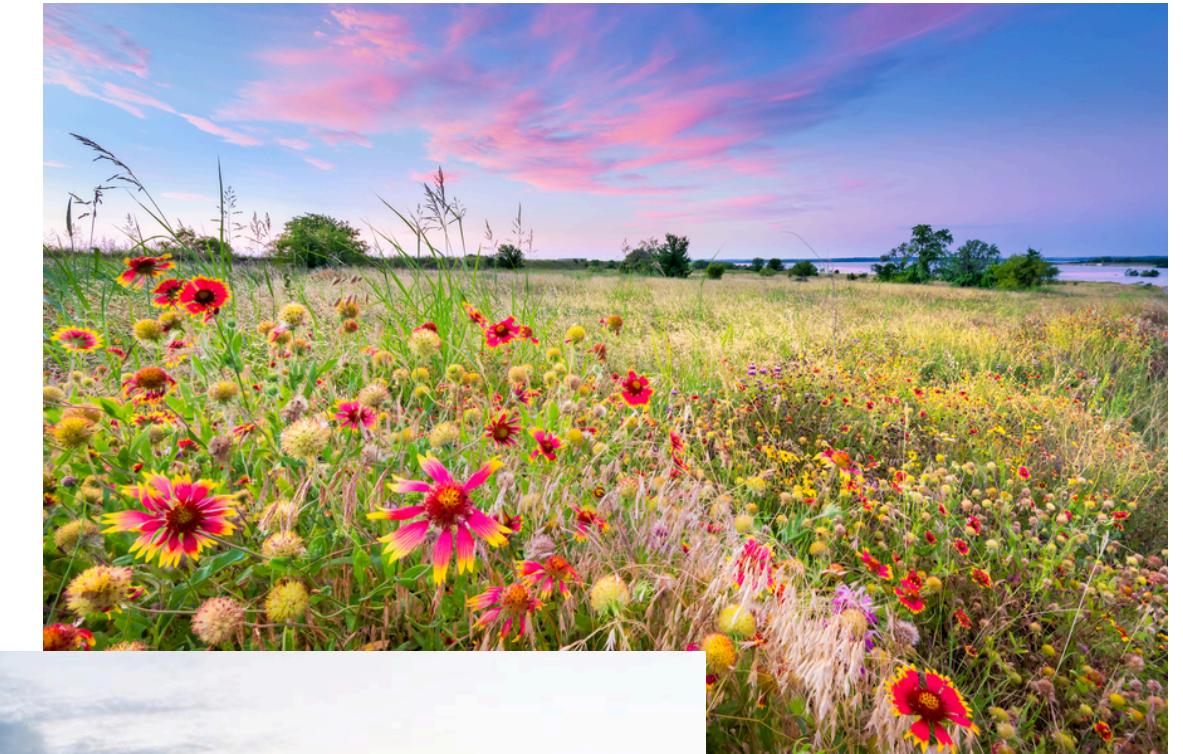
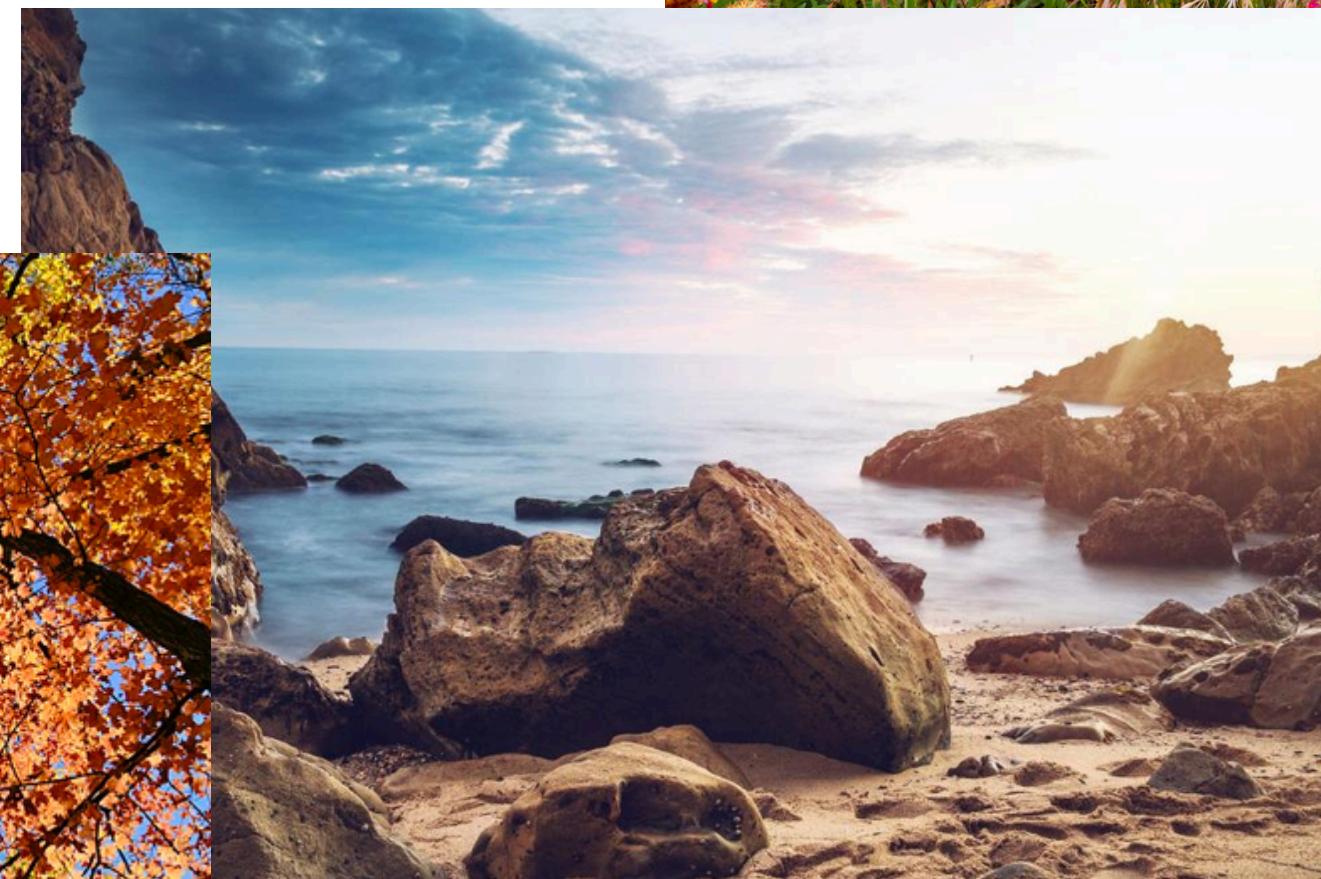
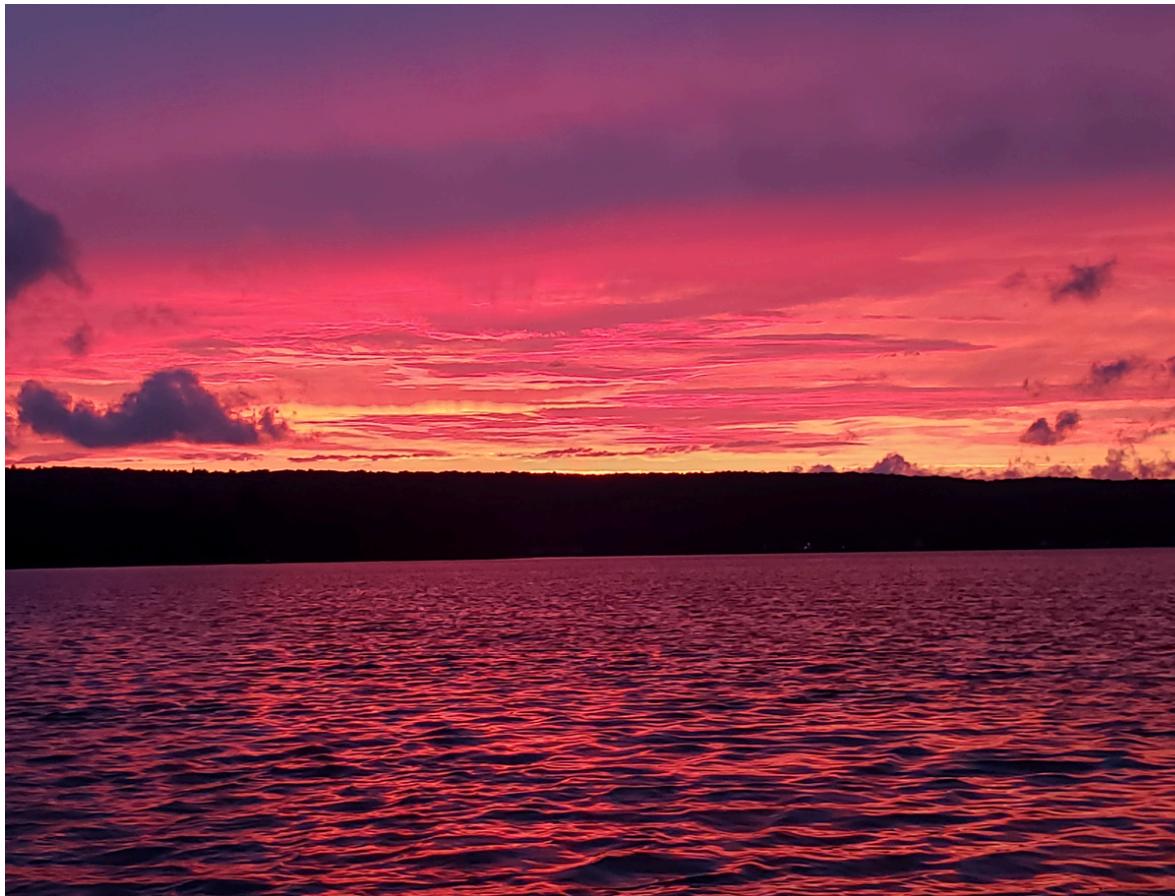
# Color Schemes: Rectangle

rich color scheme, with plenty of possibilities for variation



# Guidlines: Rules of Thumb

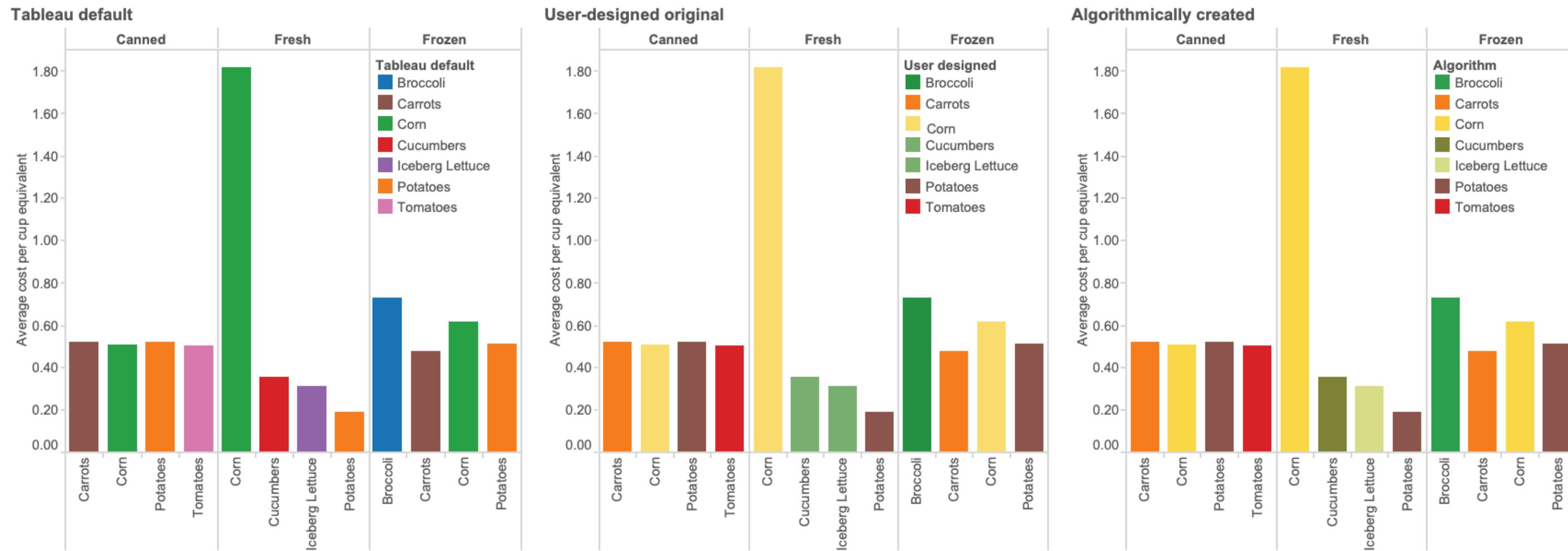
# Rule of Thumb: Look to Nature



# Rule of Thumb: Look to Nature

## A Linguistic Approach to Categorical Color Assignment for Data Visualization

Vidya Setlur, *Member, IEEE*, Maureen C. Stone, *Member, IEEE*



# Rule of Thumb: Simplicity

Choose a single “accent color” to be used in large amounts

Be selective about the base/background color

Use other colors to add interest

# Rule of Thumb: Avoid Using Color

Use neutrals (these work with any color scheme)

- black, white, grey

Use other methods than color to encode data:

- size, shape, length, width, orientation

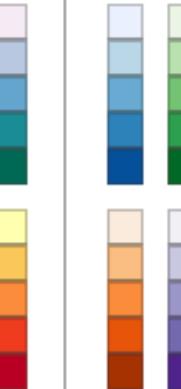
“Get it right in black and white” -Maureen Stone

# Tools for Picking Color

# colorbrewer2.org

Number of data classes: 3 i

Nature of your data: i  
 sequential  diverging  qualitative

Pick a color scheme:  
Multi-hue:   
Single hue: 

Only show: i  
 colorblind safe  
 print friendly  
 photocopy safe

Context: i  
 roads  
 cities  
 borders 

Background: i  
 solid color   
 terrain   
color transparency 

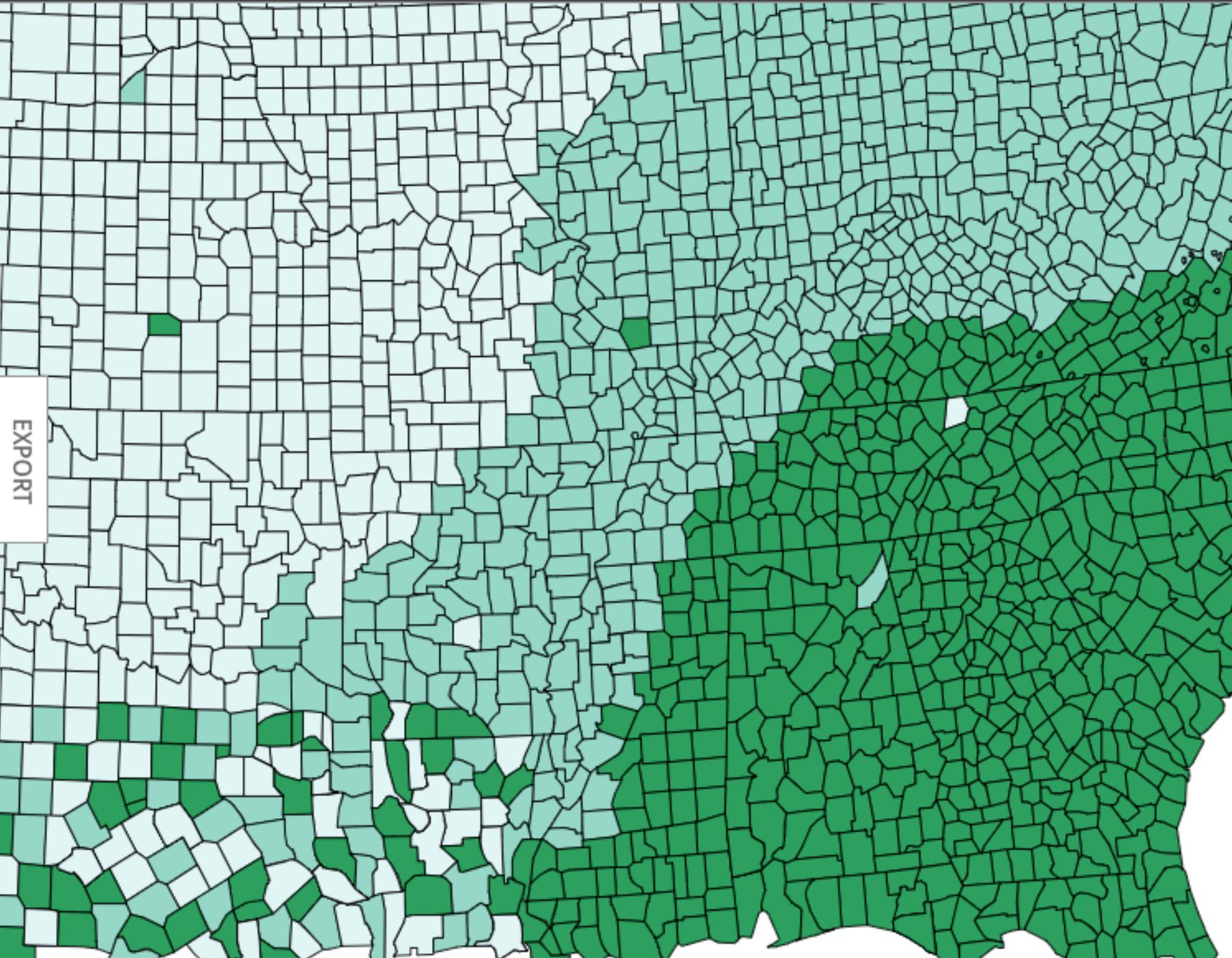
how to use | updates | downloads | credits

**COLORBREWER 2.0**  
color advice for cartography

3-class BuGn i

EXPORT

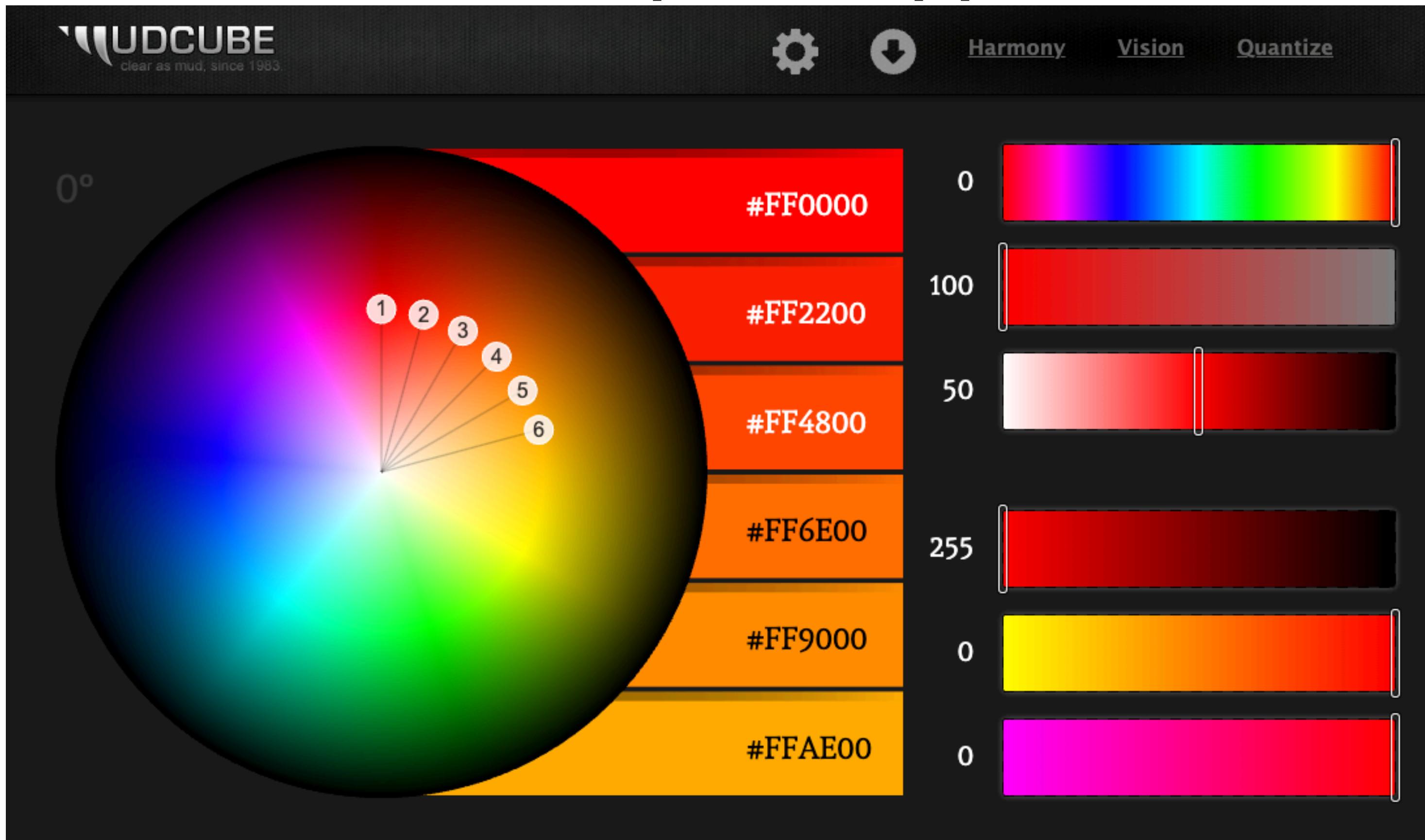
HEX v  
#e5f5f9  
#99d8c9  
#2ca25f



© Cynthia Brewer, Mark Harrower and The Pennsylvania State University  
 [Source code and feedback](#)  
[Back to Flash version](#)

 axismaps

# colorsphere.app



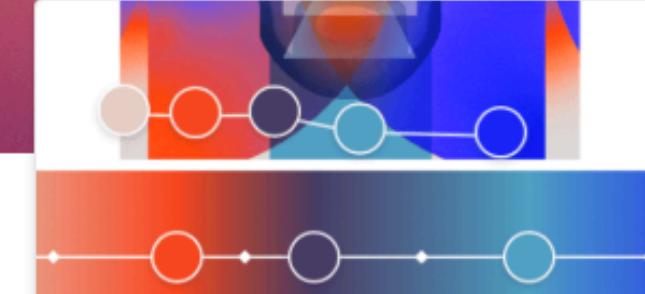
## Create beautiful palettes with Adobe Color



### Create color themes

Design color themes based on color theory with our color palette generator. Use color harmonies on the color wheel to generate beautiful color palettes.

Visit



### Extract themes & gradients

Adobe Color gives you the power to extract a beautiful gradient from any image you choose. Create on trend gradients with up to 16 different colors.

Visit



### Transfer Adobe Color themes into stunning content

Create your logos, social posts and more using Adobe Color themes in seconds with Adobe Express.

Visit

## Explore color themes

Discover popular color palettes from the Adobe Color community and search for themes by name, mood or keyword using color search. One click any color theme to edit it directly on the color wheel.

# paletton.com

English ▾ Browse 1 Million Design Assets (NEW) Like it? ▾ Paletton Live Colorizer Mobile [scheduled] More apps [scheduled] cookie settings

## paletton.com

< UNDO REDO > RESET RANDOMIZE... MORE INFO ▾

Donate

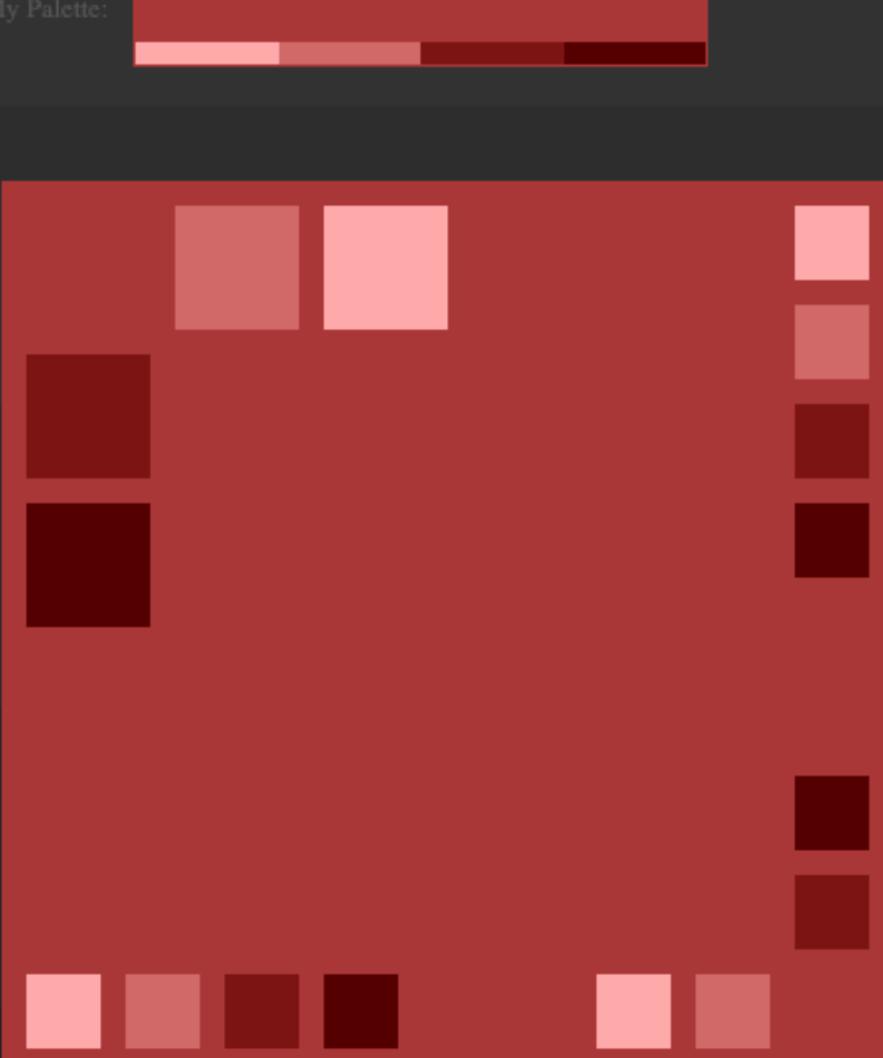
Monochromatic (1-color)  
 add complementary

Hue: 0° opposite

Base RGB: AA3939 Fine Tune...

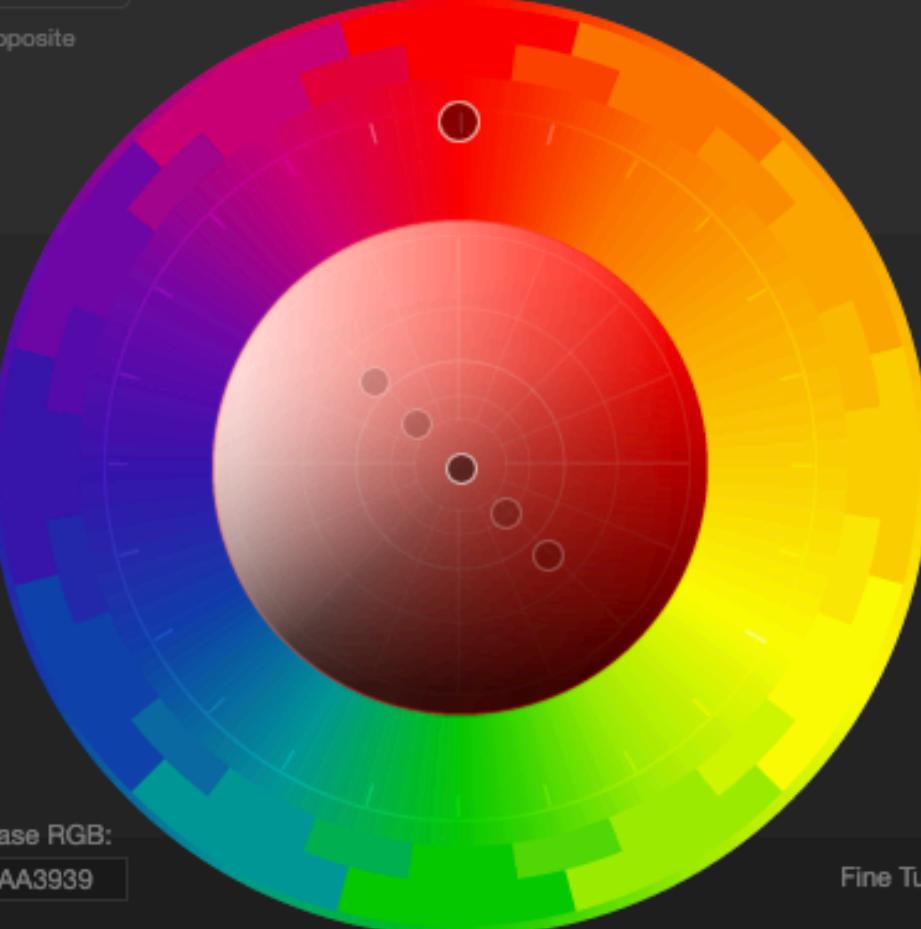
COLORS PRESETS

My Palette:



Vision simulation ▾

PREVIEW ▾ EXAMPLES... TABLES / EXPORT...



## Color Converter

Select a color space and enter your values for accurately convert your selection to Rgb, Cmy, Cmyk, Hsl, Xyz, Lab, Lch and Yxy.

Note: ColorMine uses the sRgb color space. [More information on sRgb vs AdobeRgb.](#)

**Rgb**

We've recently added support for device specific [ICC Profiles](#) for conversions to Cmyk based on your feedback. This is a new feature so please let us know if you have any questions or problems with it using the feedback form below.

**Color Space****Cmyk Profile****Convert**

## Colorblind Web Page Filter

What are color blind anomalies? ⓘ

Please indicate a resource to be viewed, and a color filter to be applied to that resource.

Type a URL:  
<https://www.toptal.com/designers/colorfilter/exar>

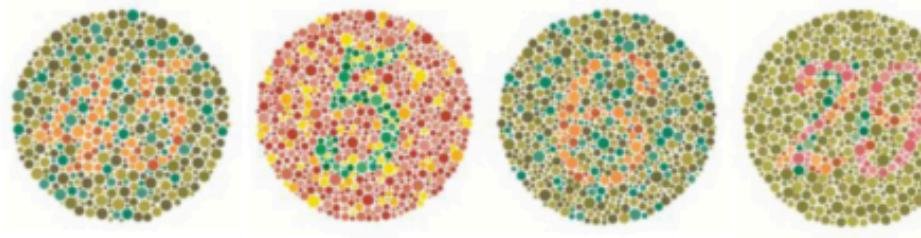
**Protanopia**  
red/green color blindness; anomalous red cones

**Deuteranopia**  
red/green color blindness; anomalous green cones

**Tritanopia**  
blue/yellow color blindness; anomalous blue cones

**Greyscale/achromatopsia**  
quick check for all forms of colorblindness

**FETCH AND FILTER!**

**Example page**  
Type your own URL at the top form to see it color-blind-filtered (at the right side).  
  
This visual perception test is known as an Ishihara test and has been used since 1917. You can read more at [Wikipedia](#).  
**Set of colors unambiguous to color vision deficient**  
and to normal sighted persons  

Original color	Seen by a...	HUE	COLOR CODE
Black	Protan Deutan Tritan	Black, 0°	#000000; RVB 0,0,0 CMJN % 0,0,0,100.
Orange	Protan Deutan Tritan	Orange, 41°	#E69F00; RVB 230,159,0 CMJN % 15,41,93,1.

  
**Set of colors unambiguous to color vision deficient**  
and to normal sighted persons  

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Orange	Protan Deutan Tritan	Orange, 41°	#E69F00; RVB 230,159,0 CMJN % 15,41,93,1.

**FIN**

## Upcoming Dates

**Feb 13: Announce Your Project**

**Feb 14: ~~Group~~ Activity 1 Due**

**Feb 14: Homework 1 Due**

**Make sure at least one member from your project team attends class on Feb 13**