# Color

### **Computer Graphics CMU 15-462/15-662**

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# Why do we need to be able to talk precisely about color?











### on screen

### printed



Credit: http://parade.com/63549/linzlowe/where-in-the-world-are-these-incredible-rainbow-mountains



Hertzsprung-Russell diagram



### Starry Night, Van Gogh

![](_page_8_Picture_0.jpeg)

Cannon Beach, Oregon

### What is color?

![](_page_9_Picture_1.jpeg)

# Light is EM Radiation; Color is Frequency

- Light is oscillating electric & magnetic field
- KEY IDEA: frequency determines color of light
- Q: What is the difference between *frequency* and *wavelength*?

![](_page_10_Picture_4.jpeg)

### s Frequency field f light *ency* and *wavelength*?

![](_page_11_Picture_0.jpeg)

### Q: Why does your stove turn red when it heats up?

### Heat generates light

- One of *many* ways light is produced:
- Maxwell: motion of charged particles creates EM field
- Thermodynamics: ... particles jiggle around!
- Hence, anything moving generates light
- In other words:
  - every object around you is producing color!
  - frequency determined by temperature

![](_page_12_Picture_8.jpeg)

![](_page_12_Picture_9.jpeg)

![](_page_12_Picture_10.jpeg)

![](_page_12_Picture_11.jpeg)

### Most light is not visible!

# Frequencies visible by human eyes are called "visible spectrum" These frequencies what we normally think of as "color"

![](_page_13_Figure_2.jpeg)

# Natural light is a mixture of frequencies "White" light is really a mixture of all (visible) frequencies

- E.g., the light from our sun

![](_page_14_Figure_3.jpeg)

### Spectrum of Solar Radiation (Earth)

Infrared Sunlight without atmospheric absorption 5778K blackbody Sunlight at sea level  $H_2O$ **Atmospheric**  $H_2O$ absorption bands  $H_2O$ **CO**<sub>2</sub> H<sub>2</sub>O 2500 1250 1500 1750 2000 1000 2250 Wavelength (nm)

# Additive vs. Subtractive Models of Light

- Spectrum we just saw for the sun *"emission spectrum"* 
  - How much light is *produced* (by heat, fusion, etc.)
  - Useful for, e.g., characterizing color of a lightbulb
  - **Another useful description:** *"absorbtion spectrum"* 
    - How much light is *absorbed* (e.g., turned *into* heat)
    - Useful for, e.g., characterizing color of paint, ink, etc.

![](_page_15_Picture_7.jpeg)

![](_page_15_Figure_9.jpeg)

### **Emission Spectrum** Describes light intensity as a function of frequency

### Below: spectrum of various common light sources:

![](_page_16_Figure_2.jpeg)

![](_page_16_Picture_3.jpeg)

### **Emission Spectrum—Example**

- Why so many different kinds of lightbulbs on the market?
- "Quality" of light:

**Incandescent:** +more sun-like -power-hungry

**CFL:** 

-"choppy" spectrum +power efficient

![](_page_17_Picture_6.jpeg)

### **Absorption Spectrum**

**Emission spectrum is intensity as a function of frequency** 

![](_page_18_Figure_2.jpeg)

Q: What color is an object with this absorption spectrum?

# Absorption spectrum is *fraction absorbed* as function of frequency

### This is the fundamental description of color: *intensity or absorption as a function of frequency*

![](_page_19_Figure_1.jpeg)

### **Everything else is merely a convenient approximation!**

![](_page_19_Picture_3.jpeg)

# If you remember to use spectral description as a starting point, the issues surrounding color theory/ practice will make a *lot* more sense!

If on the other hand you always think of color in terms of approximate digital encodings (RGB, CMYK) etc., there are certain phenomena you simply cannot explain/understand!

# Interaction of emission and reflection

- Toy model for what happens when light gets reflected
  - v—frequency (Greek "nu")
  - Light source has emission spectrum f(v)
  - Surface has reflection spectrum g(v)
  - Resulting intensity is the *product* f(v)g(v)

![](_page_22_Figure_6.jpeg)

![](_page_22_Picture_10.jpeg)

wavelength (nm)

# **Color reproduction is hard!**

**Color clearly starts to get complicated as we start combining** emission and absorption/reflection (real-world challenge!)

![](_page_23_Figure_2.jpeg)

### (What color ink should we use to get the desired appearance?)

![](_page_23_Picture_5.jpeg)

### **...And what about perception?** Q: What color is this dress?

![](_page_24_Picture_1.jpeg)

# How does electromagnetic radiation (with a given power distribution) end up being perceived by a human as a certain color?

# The eye

![](_page_26_Figure_1.jpeg)

Image credit: Georgia Retina (http://www.garetina.com/about-the-eye)

# The eye (optics)

![](_page_27_Figure_1.jpeg)

Image credit: Georgia Retina (http://www.garetina.com/about-the-eye)

### Photosensor response (eye, camera, ...)

### **Photosensor input: light**

- Electromagnetic power distribution over wavelengths:  $\Phi(\lambda)$
- Photosensor output: a "response" ... a number
  - e.g., encoded in electrical signal
- Spectral response function:  $f(\lambda)$ 
  - Sensitivity of sensor to light of a given wavelength
  - Greater  $f(\lambda)$  corresponds to more a efficient sensor (when  $f(\lambda)$  is large, a small amount of light at wavelength  $\lambda\,$  will trigger a large sensor response)
- **Total response of photosensor:**

$$R = \int_{\lambda} \Phi(\lambda) f(\lambda) d\lambda$$

![](_page_28_Picture_13.jpeg)

# The eye's photoreceptor cells: rods & cones

![](_page_29_Figure_1.jpeg)

- Rods are primary receptors under dark viewing conditions (scotopic conditions) **— Approx. 120 million rods in human eye**
- Cones are primary receptors under high-light viewing conditions (photopic conditions, e.g., daylight)
  - **—** Approx. 6-7 million cones in the human eye
  - Each of the three types of cone feature a different spectral response. This will be critical to color vision (much more on this in the coming slides)

### Density of rods and cones in the retina

![](_page_30_Figure_1.jpeg)

- Highest density of cones is in fovea (best color vision at center of where human is looking)
- Note "blind spot" due to optic nerve

![](_page_30_Picture_4.jpeg)

[Roorda 1999]

### **ACTIVITY: Rods vs. Cones**

- Grab someone and try it at home!
  - Have them hold up colored markers in peripheral vision
  - All you have to do is say what color it is (easy!)

![](_page_31_Picture_4.jpeg)

### s in peripheral vision it is (easy!)

# **Spectral response of cones** Three types of cones: S, M, and L cones (corresponding to peak response at short, medium, and long wavelengths)

0.1

0.

$$\begin{split} S &= \int_{\lambda} \Phi(\lambda) S(\lambda) d\lambda & \text{Resp} \\ M &= \int_{\lambda} \Phi(\lambda) M(\lambda) d\lambda & \text{s-Cone} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{s-Cone} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda & \text{solution} \\ L &= \int_{\lambda}$$

![](_page_32_Picture_2.jpeg)

Uneven distribution of cone types in eye ~64% of cones are L cones, ~ 32% M cones

### ponse functions for S, M, and L cones

![](_page_32_Figure_5.jpeg)

### Response of S,M,L cones to monochromatic light

### Figure visualizes cone's response to monochromatic light (light with energy in a single wavelength) as points in 3D space

(plots value of S, M, L response functions as a point in 3D space)

![](_page_33_Figure_3.jpeg)

### The human visual system

- Human eye does not directly measure the spectrum of incoming light
  - i.e., the brain does not receive "a spectrum" from the eye
- The eye measures three response values = (S, M, L). The result of integrating the incoming spectrum against response functions of S, M, L-cones

![](_page_34_Figure_4.jpeg)

# Q: Is it possible for two functions to integrate to the same value?

### Metamers

- Metamers = two different spectra that integrate to the same (S,M,L) response!
- The fact that metameters exist is critical to color reproduction: we don't have to reproduce the exact same spectrum that was present in a real world scene in order to reproduce the *perceived* color on a monitor (or piece of paper, or paint on a wall)
  - ... On the other hand, combination of light & paint could still cause trouble—different objects appearing "wrong" under different lighting conditions.

![](_page_36_Picture_4.jpeg)

### **Example: Counterfeit Detection**

Many countries print currency, passports, etc., with special inks that yield different appearance under UV light:

![](_page_37_Picture_2.jpeg)

# Ok, so color can get pretty complicated! How do we encode it in a simple(r) way?

### **Color Spaces and Color Models**

- Many ways to specify a color
  - storage
  - convenience
- In general, specify a color from some *color space* using a *color model*
- Color <u>space</u> is like artist's palette: full range of colors we can choose from
- Color <u>model</u> is the way a particular color in a color space is specified:
  - artist's palette: "yellow ochre"
  - RGB color model: 204, 119, 34

![](_page_39_Picture_9.jpeg)

![](_page_39_Figure_10.jpeg)

# **Additive vs. Subtractive Color Models**

- Just like we had emission & absorption spectra, we have additive and subtractive\* color models
- Additive
  - Used for, e.g., combining colored lights
  - Prototypical example: RGB
  - **Subtractive** 
    - Used for, e.g., combining paint colors
    - Prototypical example: CMYK

\*A better name than subtractive might be *multiplicative*, since we *multiply* to get the final color!

![](_page_40_Figure_10.jpeg)

### Let's shed some light on this picture...

![](_page_41_Picture_1.jpeg)

![](_page_41_Picture_2.jpeg)

# **Other Common Color Models**

- HSV
  - hue, saturation, value
  - more intuitive than RGB/CMYK
- SML—physiological model
  - corresponds to stimulus of cones
  - not practical for most color work
- XYZ—preceptually-driven model
  - Y captures *luminance* (intensity)
  - X,Z capture *chromaticity* (color)
  - related to, but different from, SML
  - Lab—"perceptually uniform" modification of XYZ

![](_page_42_Picture_12.jpeg)

![](_page_42_Figure_13.jpeg)

HUR

# **Practical Encoding of Color Values**

- How do colors actually get encoded digitally?
- **One common encoding (e.g., HTML):** *8bpc hexadecimal values\**:

### #1B1F8A

- What does this string mean? Common encoding of RGB.
- Want to store 8-bits per channel (red, green, blue), corresponding to 256 possible values
- Rather than use digits 0-9, use 0, 1,2,3,4,5,6,7,8,9,A,B,C,D,E,F
- Single character now encodes 16 values, two characters encode 16\*16 = 256 values
- Q: Roughly what color is # f f 6600?

\*Upper vs. lowercase letters? Makes absolutely *no* difference!

# **Other Ways of Specifying Color?**

- **Other color specifications not based on continuous color space**
- E.g., Pantone Matching System
  - industry standard (proprietary)
  - 1,114 colors
  - Combination of 13 base pigments
  - And not to forget...

![](_page_44_Picture_7.jpeg)

![](_page_44_Picture_9.jpeg)

# Why use different color models?

- Convenience
  - Is it easy for a user to choose the color they want?
- Color compositing/processing
  - Does it matter what color space we interpolate / blend in?
  - **Efficiency of encoding** 
    - E.g., use more of numerical range for perceptually significant colors
    - **Compression!**

![](_page_45_Picture_8.jpeg)

![](_page_45_Picture_9.jpeg)

![](_page_45_Picture_10.jpeg)

**Bover** A

![](_page_45_Picture_12.jpeg)

### Example: Y'CbCr color model

- Common for modern digital video
- Y' =luma: perceived luminance (same as L\* in CIELAB)
- Cb = blue-yellow deviation from gray
- Cr = red-cyan deviation from gray

![](_page_46_Picture_5.jpeg)

![](_page_46_Picture_6.jpeg)

![](_page_46_Picture_7.jpeg)

![](_page_46_Picture_8.jpeg)

Cr

![](_page_46_Figure_10.jpeg)

![](_page_47_Picture_0.jpeg)

### **Original picture**

![](_page_48_Picture_0.jpeg)

Contents of CbCr color channels downsampled by a factor of 20 in each dimension (400x reduction in number of samples)

![](_page_49_Picture_0.jpeg)

### Full resolution sampling of luma (Y')

![](_page_50_Picture_0.jpeg)

### Reconstructed result (looks pretty good)

![](_page_51_Picture_0.jpeg)

### **Original picture**

### By the way, how might we reduce this artifact?

![](_page_52_Picture_1.jpeg)

### **Reconstructed result**

# Why use different color models? (cont.)

- Convenience
  - Is it easy for a user to choose the color they want?
- Efficiency of encoding
  - E.g., use more of numerical range for perceptually significant colors
  - Do color images *compress* well?
  - Gamut
    - Which colors can be expressed using a given model?
    - Very different for print vs. display

![](_page_53_Picture_9.jpeg)

RGB

![](_page_53_Picture_11.jpeg)

![](_page_53_Picture_12.jpeg)

### Which raises a very important question:

# Which actual colors (i.e., *spectra*) do these values get mapped to?

### CIE 1931\* Color Space

- Standard "reference" color space
- Encompasses all colors visible by "most" human observers

-	associated color <i>model</i> (XYZ)	0.9
	captures perceptual effects	0.8

- 0.7 - e.g., perception of color 0.6 ("chromaticity") changes w/ 500-0.5 y brightness ("luminosity") 0.4
- different from specifying 0.3 0.2 direct simulation of cones 0.1 (SML) 0.0

![](_page_55_Figure_9.jpeg)

### **Chromaticity Diagrams**

- Chromaticity is the intensity-independent component of a color
- Chromaticity diagram used to visualize extent of a color space

![](_page_56_Figure_3.jpeg)

A display with primaries with chromacities P<sub>1</sub>, P<sub>2</sub>, P<sub>3</sub> can create colors that are combinations of these primaries (colors that fall within the triangle)

### ent component of a color extent of a color space

# **sRGB Color Space**

- CIE 1934 captured all possible human-visible colors
- sRGB (roughly) subset of colors available on displays, printers, ...
- Nonlinear relationship between stored RGB values & intensity
  - Makes better use of limited set of numerical values

![](_page_57_Figure_5.jpeg)

### sible colors e on displays, printers, ... RGB values & intensity merical values

# **Color Acuity (MacAdam Ellipse)**

- In addition to range of colors visible, one might be interested in how sensitive people are to changes in color
- Each ellipse corresponds to a region of "just noticeable differences" of color (chromaticity)
- So, if you want to make two colors distinct, at bare minimum should avoid overlapping ellipses...

![](_page_58_Figure_4.jpeg)

### Nonstandard Color Vision

- Morphological differences in eye can cause people (& animals) to see different ranges of color (e.g., more/fewer cone types)
- Alternative chromaticity diagrams help visualize color gamut, useful for designing, e.g., widely-accessible interfaces

![](_page_59_Figure_3.jpeg)

### use people (& animals) ore/fewer cone types) visualize color gamut, ible interfaces

# **Color Conversion**

- Given a color specified in one model/space (e.g., sRGB), try to find corresponding color in another model (e.g., CMYK)
- In a perfect world: want to match *output spectrum*
- Even matching *perception* of color would be terrific (metamers)
- In reality: may not always be possible!
  - Depends on the gamut of the output device
  - E.g., VR headset vs. inkjet printer
- **Complicated task!**
- Lots of standards & software
  - **ICC Profiles**
  - Adobe Color Management, ...

![](_page_60_Picture_14.jpeg)

### **Gamma correction**

### (non-linear correction for CRT display)

### **Old CRT display:**

- 1. Image contains value X
- 2. CRT display converts digital signal to an electron beam voltage V(x) (linear relationship)
- 3. Electron beam voltage converted to light: (non-linear relationship)

 $\gamma \propto V^{\gamma}$ Where:  $\gamma \approx 2.5$ 

So if pixels store Y, what will the display's output look like?

### Fix: pixels sent to display must store:

 $Y^{1/2.5} \equiv Y^{0.4}$ 

![](_page_61_Picture_11.jpeg)

**Observed** display output

Image credit: http://creativebits.org/mac\_os\_x/windows\_vs\_mac\_monitor\_gamma

![](_page_61_Picture_14.jpeg)

(Doesn't apply to modern LCD displays, whose luminance output is linearly proportional to input; DOES still apply to other devices, like sensors, etc.)

### Desired display output

### Human Perception—Acommodation Effect

![](_page_62_Picture_1.jpeg)

### Human Perception—Acommodation Effect

### Next time...

- A whole spectrum of things to know about light & color
- In the next few lectures we'll talk more about
  - radiometry
  - cameras
  - scattering

![](_page_64_Picture_6.jpeg)

### out light & color about