CS-184: Computer Graphics

Lecture #2: Color

Prof. James O'Brien
University of California, Berkeley

V2016-F-02-1.0

With material from Ren Ng and Steve Marschner

Announcements

- Sign up for Piazza
- Assignment 0: due Friday, September 2nd., 11:59pm
  - See Piazza for class accounts
  - Email inst@eecs.berkeley.edu if unable to activate
- Homework 1: due Wednesday, August. 31st, 1:00pm
- Wait list...

Today

- Color, Light, and Perception

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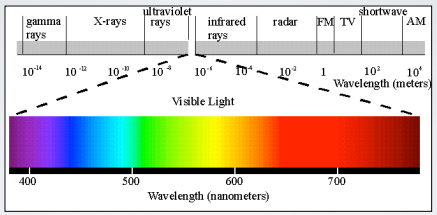
What is Light?

- Radiation in a particular frequency range



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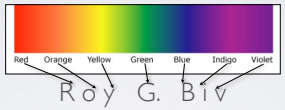
credit: Science Media Group.

Spectral Colors

- Light at a single frequency
  - Also called **monochromatic** (an overloaded term)

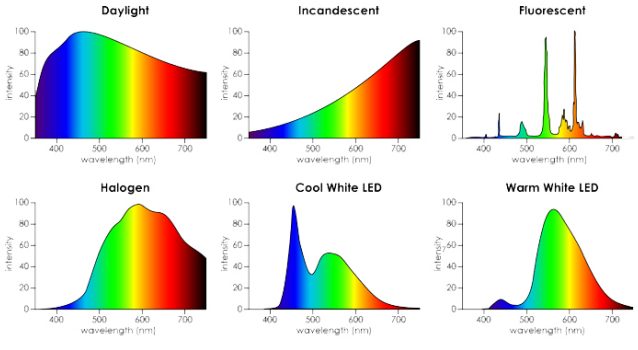


- Bright and distinct in appearance

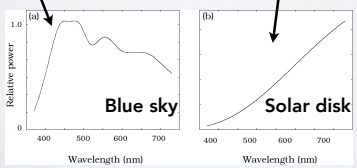
White LED

Reproductions only, can't show a real spectral color!

Other Colors

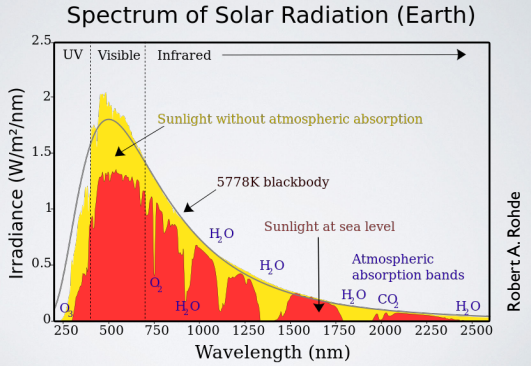


Other Colors



[Brian Wandell]

Other Colors



Other Colors

- Most colors seen are a mix light of several frequencies

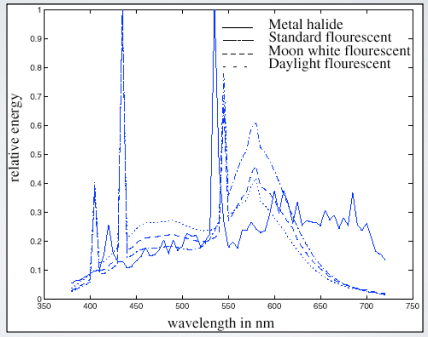


Image from David Forsyth

Other Colors

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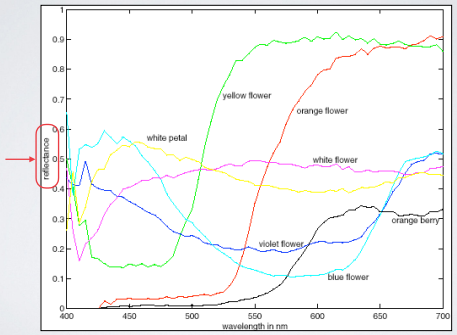

Image from David Forsyth

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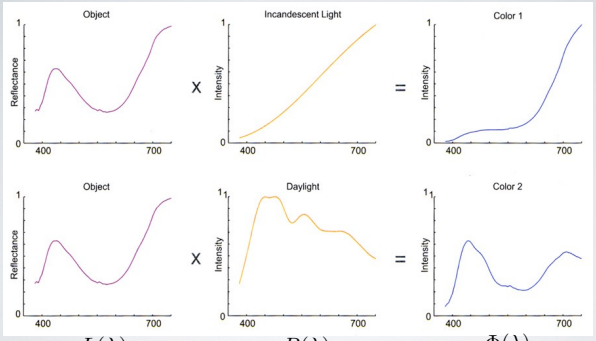
Reflected Light



[Stone 2003]

$L(\lambda)$ $R(\lambda)$ $\Phi(\lambda)$

$$\Phi(\lambda) = L(\lambda) \times R(\lambda) \ \ \mathrm{d}\lambda$$

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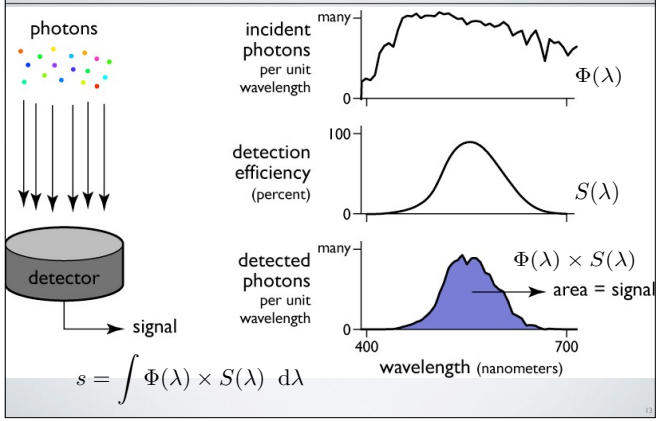
Simple Model of a Detector



$$s = \int \Phi(\lambda) \times S(\lambda) \ \mathrm{d}\lambda$$

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Perception -vs- Measurement

- You do not "see" the spectrum of light
  - Eyes make limited measurements
  - Eyes physically adapt to circumstance
  - You brain adapts in various ways also
  - Weird psychological/psychophysical stuff also happens

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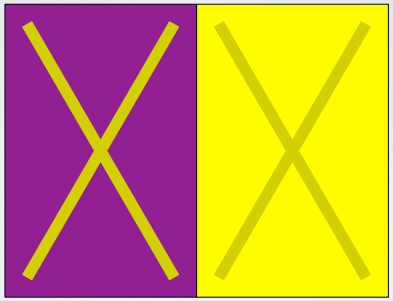
Everything is Relative



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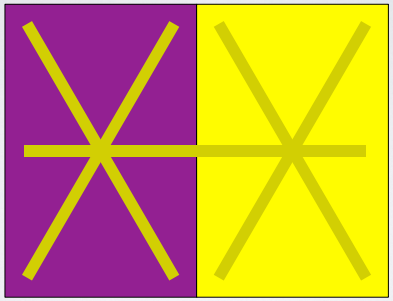
Everything is Relative



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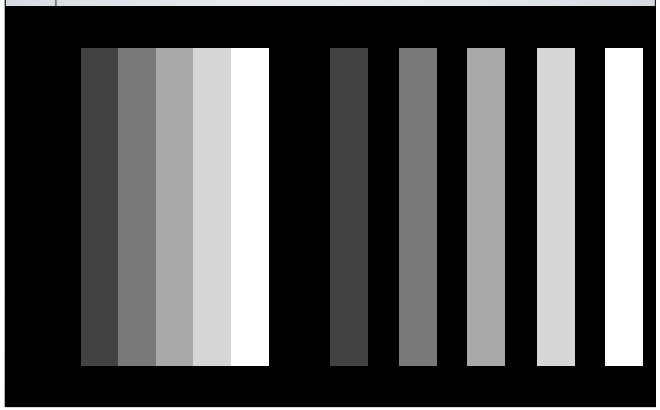
Adapt

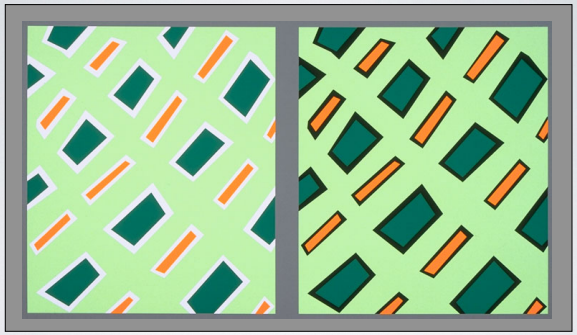
Adapt

Mach Bands



Everything's Still Relative

Bezold Effect



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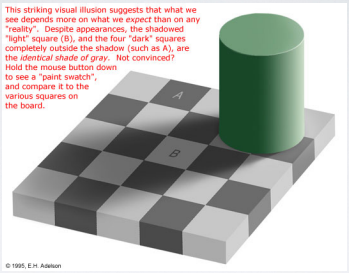
Perception

The eye does not see intensity values...



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Perception

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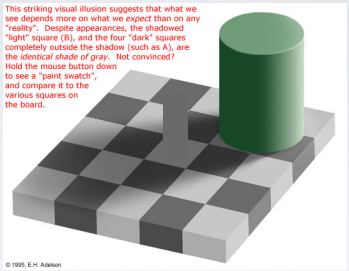
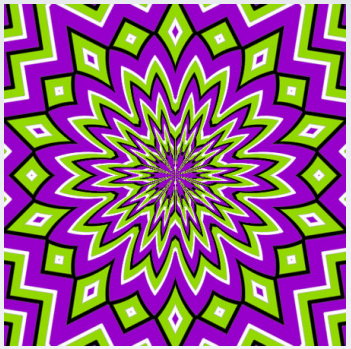


Perception

The eye does not see intensity values...

Perception



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Eyes as Sensors

- The human eye contains cells that sense light
  - Rods
    - No color (sort of)
    - Spread over the retina
    - More sensitive
  - Cones
    - Three types of cones
    - Each sensitive to different frequency distribution
    - Concentrated in fovea (center of the retina)
    - Less sensitive

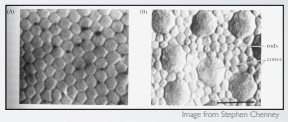

Image from Stephen Chenney

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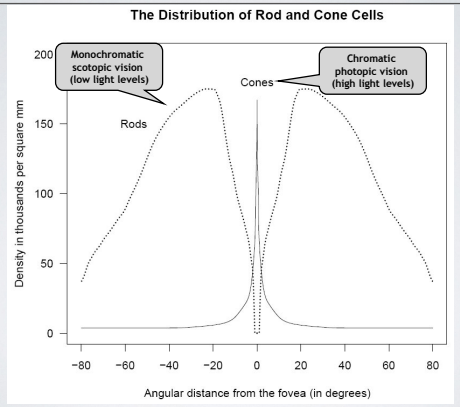
Eyes as Sensors



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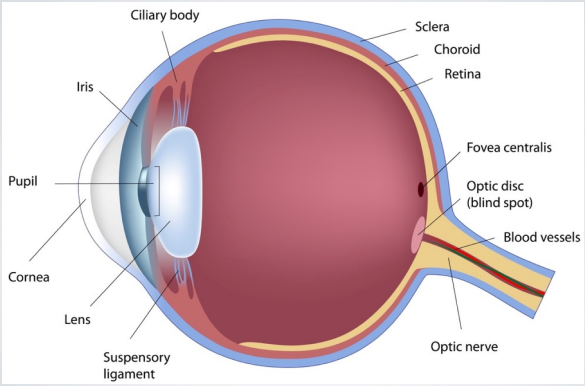
Eyes as Sensors



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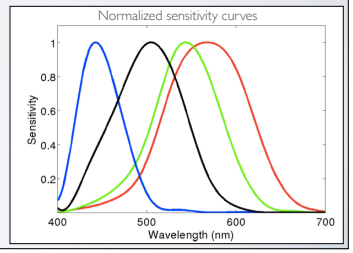
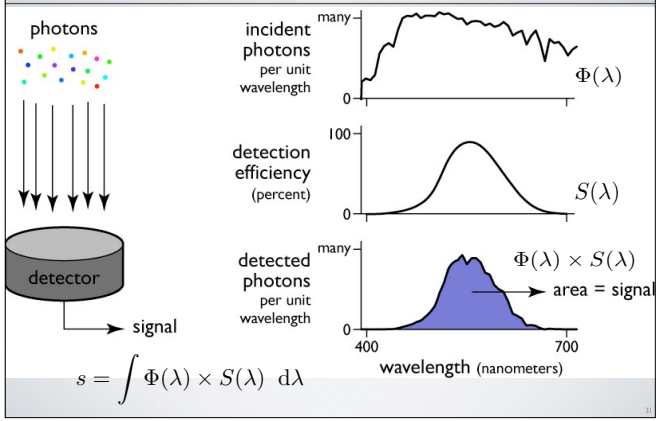
Cones

- Each type of cone responds to different range of frequencies/wavelengths
  - Long, medium, short
- Also called by color
  - Red, green, blue
  - Misleading:

    "Red" does not mean your "red" cones are firing...



Recall



$$s = \int \Phi(\lambda) \times S(\lambda) \ \mathrm{d}\lambda$$

Cones

- Response of a cone is given by a convolution integral :

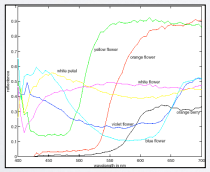
$$l = \int \Phi(\lambda) \times L(\lambda) \ \mathrm{d}\lambda$$

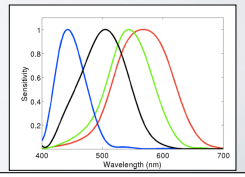
$$m = \int \Phi(\lambda) \times M(\lambda) \ \mathrm{d}\lambda$$

$$s = \int \Phi(\lambda) \times S(\lambda) \ \mathrm{d}\lambda$$

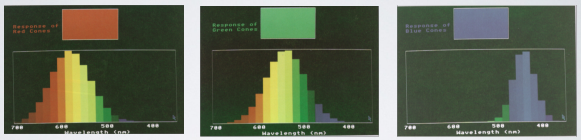
continuous version of a dot product

$$l = \sum \Phi_i \times L_i$$





Cones



Images from David Forsyth

- You can see that "red" and "green" respond to more more than just red and green...

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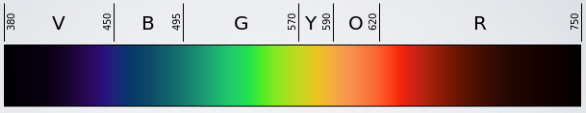
Cones



Images from David Forsyth

- Our perception of color is not evenly spaced in wavelength.

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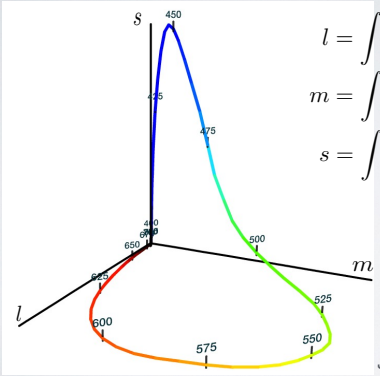
Cones



$$l = \int \Phi(\lambda) \times L(\lambda) \ \mathrm{d}\lambda$$

$$m = \int \Phi(\lambda) \times M(\lambda) \ \mathrm{d}\lambda$$

$$s = \int \Phi(\lambda) \times S(\lambda) \ \mathrm{d}\lambda$$

Marc Levoy

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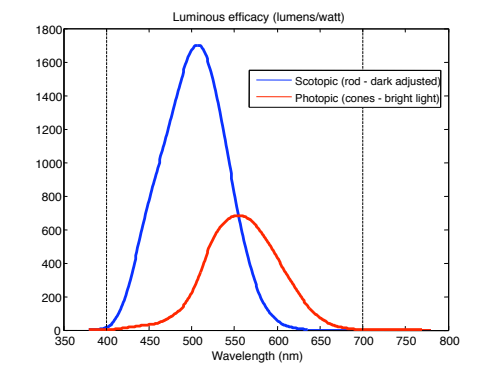
Rods vs Cones



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Cones and Metamers

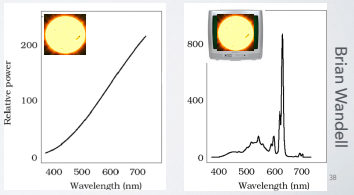
Cone response is an integral

$$L = \int \Phi(\lambda) L(\lambda) \mathrm{d}\lambda \quad M = \int \Phi(\lambda) M(\lambda) \mathrm{d}\lambda \quad S = \int \Phi(\lambda) S(\lambda) \mathrm{d}\lambda$$

•

Metamers: Different light input $\Phi_1(\lambda), \Phi_2(\lambda)$ produce same L, M, S cone response

- Different spectra look the same
- Useful for measuring color



Brian Wandell

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Trichromaticity

Eye records color by 3 measurements

We can "fool" it with combination of 3 signals

So display devices (monitors, printers, etc.) can generate perceivable colors as mix of 3 primaries

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Cone Responses are Linear

- Response to stimulus Φ_1 is (L_1, M_1, S_1)
- Response to stimulus Φ_2 is (L_2, M_2, S_2)
- Then response to $\Phi_1 + \Phi_2$ is $(L_1 + L_2, M_1 + M2, S_1 + S_2)$
- Response to $n\Phi_1$ is (nL_1, nM_2, nS_1)

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Additive Mixing

- Given three primaries we agree on p_1, p_2, p_3
- Match generic input light with $\Phi = \alpha p_1 + \beta p_2 + \gamma p_3$
- Negative not realizable, but can add primary to test light
- Color now described by α, β, γ

- Example: computer monitor [RGB]

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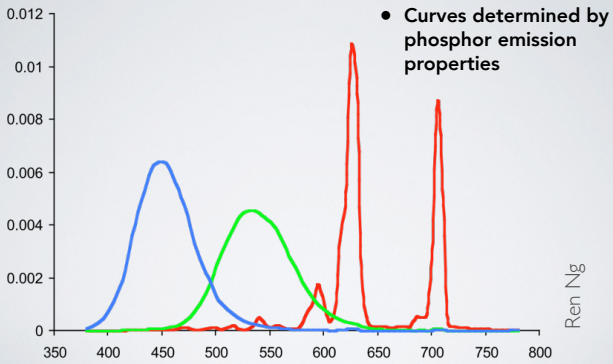
CRT Primaries



- **Curves determined by phosphor emission properties**

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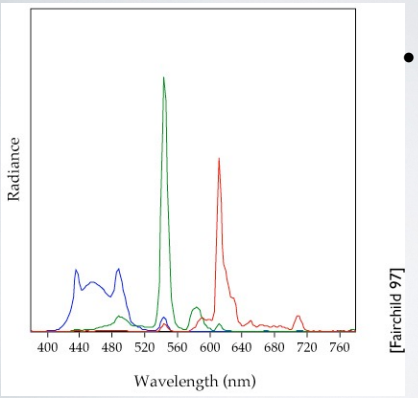
LCD Primaries



[Fairchild 97]

- Curves determined by (fluorescent) backlight and filters

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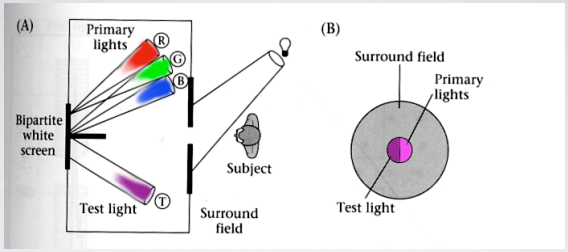
Additive Color Matching



Show test light spectrum on left

Mix "primaries" on right until they match

The primaries need not be RGB

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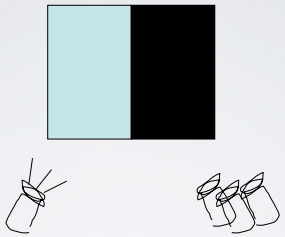
Experiment 1



Slide from Durand and Freeman 06

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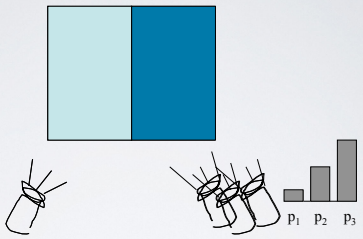
Experiment 1



Slide from Durand and Freeman 06

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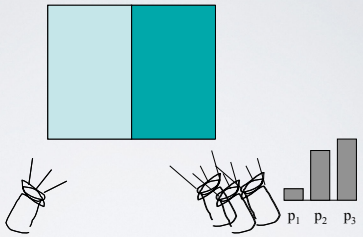
Experiment 1



Slide from Durand and Freeman 06

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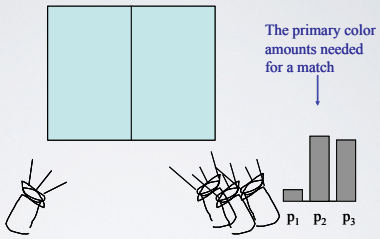
Experiment 1



Slide from Durand and Freeman 06

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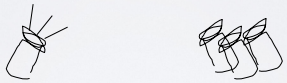
Experiment 2



Slide from Durand and Freeman 06

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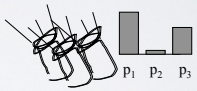
Experiment 2



Slide from Durand and Freeman 06

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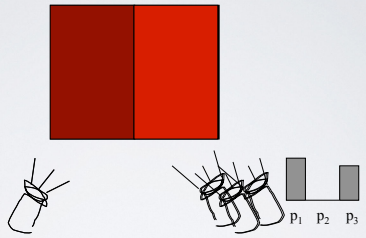
Experiment 2



Slide from Durand and Freeman 06

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Experiment 2

We say a "negative" amount of p_2 was needed to make the match, because we added it to the test color's side.

The primary color amounts needed for a match:

Slide from Durand and Freeman 06

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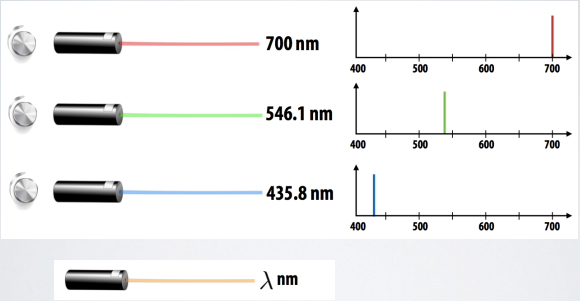
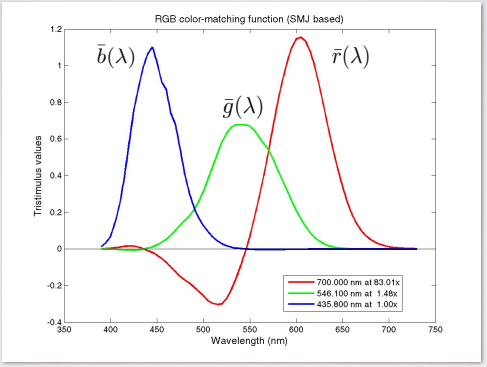
Color Matching Functions



Kayvon Fatahalian

Color Matching Functions

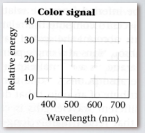


Input wavelengths are CIE 1931 monochromatic primaries

Using Color Matching Functions

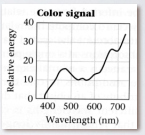
- For a monochromatic light of wavelength λ_i we know the amount of each primary necessary to match it:

$$\bar{r}(\lambda_i), \bar{g}(\lambda_i), \bar{b}(\lambda_i)$$



- Given a new light input signal

$$\Phi = \begin{pmatrix} \phi(\lambda_1) \\ \vdots \\ \phi(\lambda_N) \end{pmatrix}$$



- Compute the primaries necessary to match it

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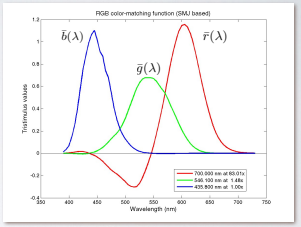
Using Color Matching Functions

- Given color matching functions in matrix form and new light

$$C = \begin{pmatrix} \bar{r}(\lambda_1) & \dots & \bar{r}(\lambda_N) \\ \bar{g}(\lambda_1) & \dots & \bar{g}(\lambda_N) \\ \bar{b}(\lambda_1) & \dots & \bar{b}(\lambda_N) \end{pmatrix}$$

$$\Phi = \begin{pmatrix} \phi(\lambda_1) \\ \vdots \\ \phi(\lambda_N) \end{pmatrix}$$



- amount of each primary necessary to match is given by

$$\begin{pmatrix} r \\ g \\ b \end{pmatrix} = \mathbf{C} \cdot \Phi$$

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Using Color Matching Functions

$$\begin{pmatrix} r \\ g \\ b \end{pmatrix}_{\text{CRT}} = \mathbf{C}_{\text{CRT}} \cdot \Phi \qquad \begin{pmatrix} r \\ g \\ b \end{pmatrix}_{\text{LCD}} = \mathbf{C}_{\text{LCD}} \cdot \Phi$$

$$\begin{pmatrix} r \\ g \\ b \end{pmatrix}_{\text{LCD}} = \mathbf{C}_{\text{LCD}} \cdot \mathbf{C}_{\text{CRT}}^{-\text{P}} \cdot \begin{pmatrix} r \\ g \\ b \end{pmatrix}_{\text{CRT}}$$

$$\begin{pmatrix} r \\ g \\ b \end{pmatrix}_{\text{LCD}} = \mathbf{C}_{\text{CRT}\rightarrow\text{LCD}} \cdot \begin{pmatrix} r \\ g \\ b \end{pmatrix}_{\text{CRT}}$$

$$\begin{pmatrix} r \\ g \\ b \end{pmatrix}_{\text{display}} = \mathbf{C}_{\text{display}} \cdot \begin{pmatrix} r \\ g \\ b \end{pmatrix}_{\text{sRGB}}$$

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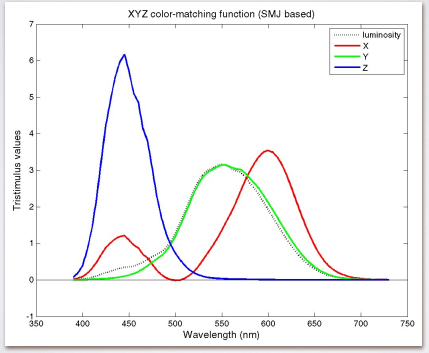
CIE XYZ

Imaginary set of color primaries with positive values, X, Y, Z



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Rescaled XYZ to xyz

Rescale X, Y, and Z to remove luminance, leaving chromaticity:

$$x = X / (X+Y+Z)$$
$$y = Y / (X+Y+Z)$$
$$z = Z / (X+Y+Z)$$

$$x+y+z = 1$$

Because the sum of the chromaticity values x, y, and z is always 1.0, a plot of any two of them loses no information

Such a plot is a chromaticity diagram

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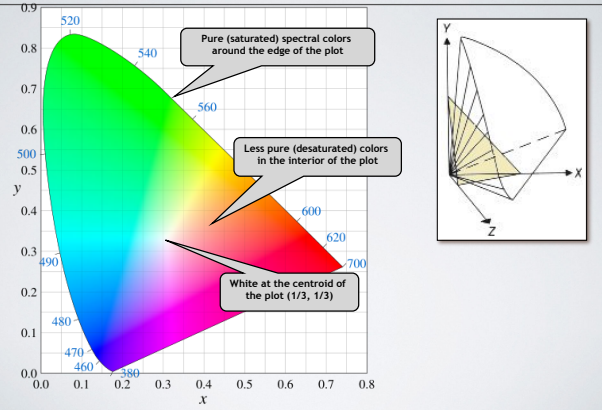
CIE Chromaticity Diagram



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Gamut

- Gamut is the chromaticities generated by a set of primaries
- Because everything we've done is linear, interpolation between chromaticities on a chromaticity plot is also linear
- Thus the gamut is the convex hull of the primary chromaticities

- What is the gamut of the CIE 1931 primaries?

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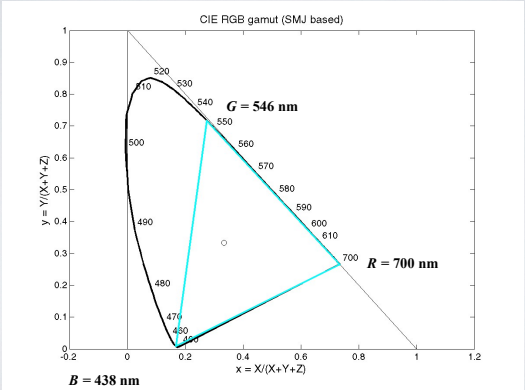
CIE 1931 RGB Gamut



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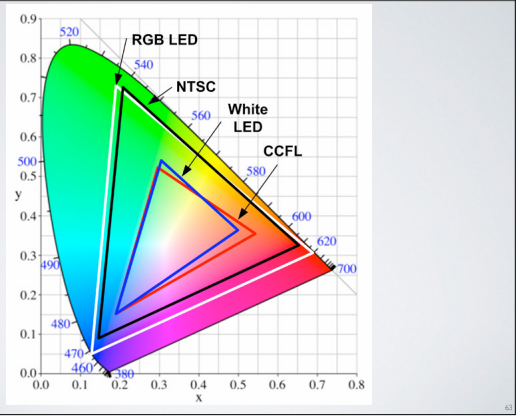
Other Gamuts (LCDs and NTSC)



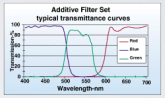
Subtractive Mixing

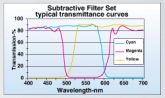
- Given three primaries we agree on p_1, p_2, p_3
- Make generic color with $\Phi = W - (\alpha p_1 + \beta p_2 + \gamma p_3)$
- Max limited by W
- Color now described by α, β, γ

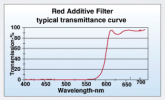
- Example: ink [CMYK]

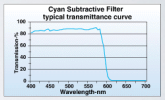
Why 4th ink for black?

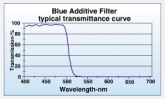
Additive & Subtractive Primaries

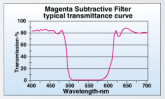


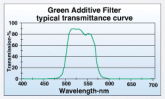


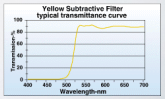












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Additive & Subtractive Primaries

- Incorrect to say "the additive primaries are red, green, and blue"
  - Any set of three non-collinear primaries yields a gamut
  - Primaries that appear red, green, and blue are a good choice, but not the only choice
  - Are additional (non-collinear) primaries always better?
- Similarly saying "the subtractive primaries are magenta, cyan, and yellow" is also incorrect, for the same reasons
  - Subtractive primaries must collectively block the entire visible spectrum, but many sets of blockers that do so are acceptable "primaries"
  - The use of black ink (the K in CMYK) is a good example
  - Modern ink-jet printers often have 6 or more ink colors

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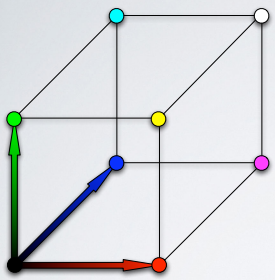
Color Spaces



RGB color cube

- Does not correspond very well to perception (e.g. distance between two points has little meaning)

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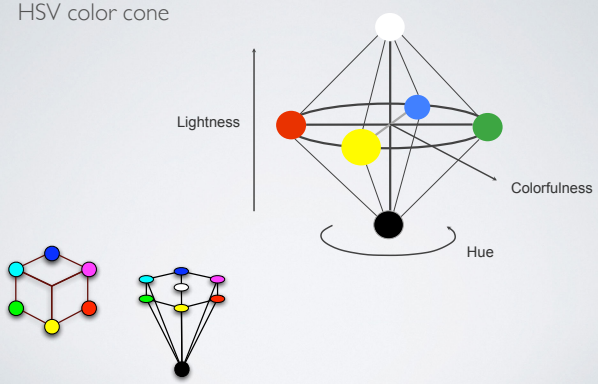
Color Spaces

HSV color cone



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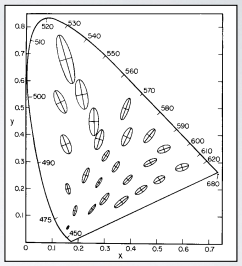
Color Spaces

RGB color cube

HSV color cone

CIE (x,y)



MacAdam Ellipses (10x)

Colors in ellipses indistinguishable from center.

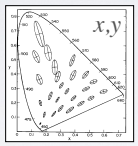
Color Spaces

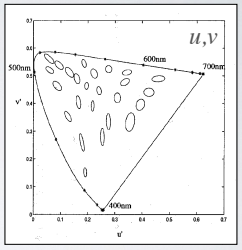
RGB color cube

HSV color cone

CIE (x,y)

CIE (u,v)





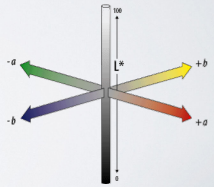
Scaled to be closer to circles.

$$\begin{bmatrix} u' \\ v' \end{bmatrix} = \frac{1}{X + 15Y + 3Z} \begin{bmatrix} 4X \\ 9Y \end{bmatrix}$$

CIELAB Space (AKA L*a*b*)

A commonly used color space that strives for perceptual uniformity

- L* is lightness
- a* and b* are color-opponent pairs
  - a* is red-green
  - b* is blue-yellow
- Nonlinear transformation from CIEXYZ to CIELAB
- Visual system appears to encode color this way (opponent color theory)
  - Afterimages
  - No "redish green" or "blueish yellow"



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Monitor Intensity and Gamma

- Monitors convert **pixel value into intensity level**
  - 0.0 maps to zero intensity = black (well not quite)
  - 1.0 maps to full intensity = white
- Monitors are not linear
  - 0.5 does not map to "halfway" gray, (e.g. 0.5 might map to 0.217)
  - Nonlinearity characterized by exponential function

$$I = a^{\gamma}$$

where I = displayed intensity and a = pixel value (between 0 and 1)

  - For many monitors γ is near 2 (often between 1.8 and 2.2)

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Determining Gamma $I = a^\gamma$

- Suppose I know displayed intensity of a patch $I = 0.5$

$$0.5 = a^\gamma$$

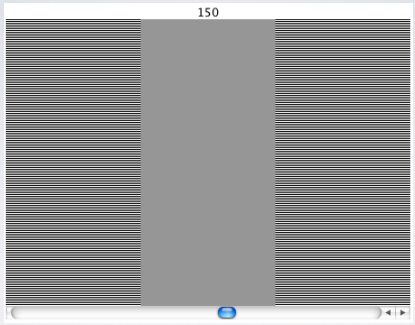
- Let viewer adjust pixel value a of nearby patch until match

$$\gamma = \frac{\ln 0.5}{\ln a}$$

Patch of known $I = 0.5$	Viewer adjusts pixel values a until this patch visually matches

- How do we make a patch of known intensity?

Determining Gamma



http://www.cs.cornell.edu/Courses/cs4620/2008fa/homeworks/gamma.htm

Dynamic Range

Surface of the sun	**2,000,000,000**	**nits**
Sunlight clouds	**30,000**	
Clear sky	**3,000**	
Cellphone display	**500**	
Overcast sky	**300**	
Scene at sunrise	**30**	
Scene lit by moon	**0.001**	
Threshold of vision	**0.000001**	

1nit = 1 candela / m^2

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Dynamic Range

- Max/min values also limited on devices
  - "blackest black"
  - "brightest white"

Jack Tumblin

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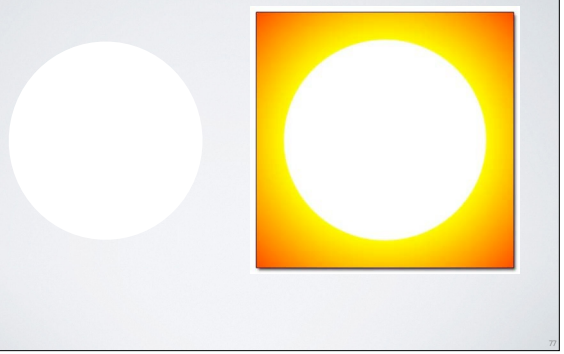
Fake High Dynamic Range



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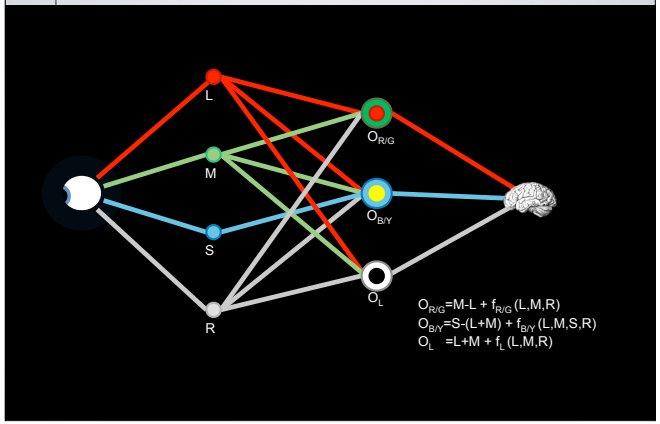
Tone Mapping

Kirk and O'Brien 2011

Rods Contribute to Color



Color Phenomena

- Light sources seldom shine directly in eye
- Light follows some transport path, ***i.e.:***
  - Source
  - Air
  - Object surface
  - Air
  - Eye
- Color effected by interactions

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Reflection

- Light strikes object
- Some frequencies reflect
- Some adsorbed
- Reflected spectrum is light times surface
- Recall metamers...

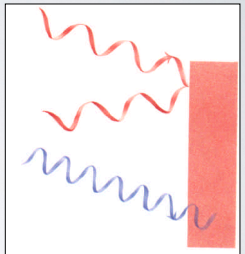

Fig. 1.18 Reflection: red light bounces off an opaque red object, while light of other colours is absorbed.

Unknown?

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Transmission

- Light strikes object
- Some frequencies pass
- Some adsorbed (or reflected)

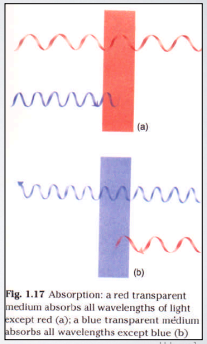

Fig. 1.17 Absorption: a red transparent medium absorbs all wavelengths of light except red (a); a blue transparent medium absorbs all wavelengths except blue (b)

Unknown?

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Scattering

- Interactions with small particles in medium
- Long wavelengths ignore
- Short ones scatter

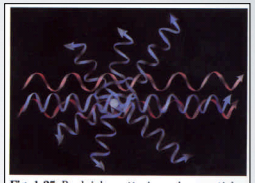

Fig. 1.25 Rayleigh scattering: when particles in air or water are small relative to light wavelength they scatter blue light preferentially.

Unknown?

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Interference

- Wave behavior of light
  - Cancelation
  - Reinforcement
- Wavelength dependent

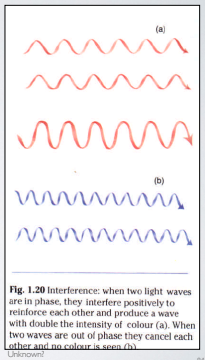

Fig. 1.20 Interference: when two light waves are in phase, they interfere positively to reinforce each other and produce a wave with double the intensity of colour (a). When two waves are out of phase they cancel each other and no colour is seen (b).

Unknown?

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Iridescence

- Interaction of light with
  - Small structures
  - Thin transparent surfaces

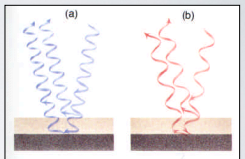
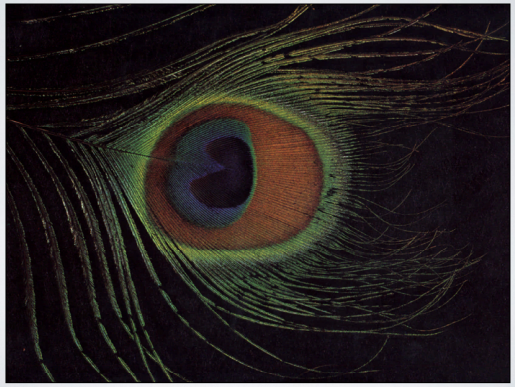


Fig. 1.22 Iridescence: when a light wave is partially reflected and partially transmitted at the surface of a thin layer of transparent material (e.g. a bubble), the two parts of the original wave may interfere with each other when the transmitted wave is reflected from a lower layer and re-emerges at the surface. In this case the blue waves are in phase and their colour is reinforced (a) but the red waves are out of phase and their colour is cancelled (b).

Unknown?

85

Iridescence



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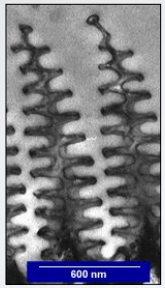
Iridescence



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Fluorescence / Phosphorescence

- Photon come in, knocks up electron
- Electron drops and emits photon at other frequency
- May be some latency

- Radio active decay can also emit visible photons

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Fluorescence / Phosphorescence

Black Body Radiation

- Hot objects radiate energy
- Frequency is temperature dependent
- Moderately hot objects get into visible range
- Spectral distribution is given by

$$E(\lambda) \propto \left(\frac{1}{\lambda^5}\right)\left(\frac{1}{\exp(hc/k\lambda T)-1}\right)$$

- Leads to notion of "color temperature"

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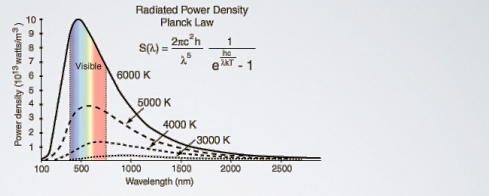
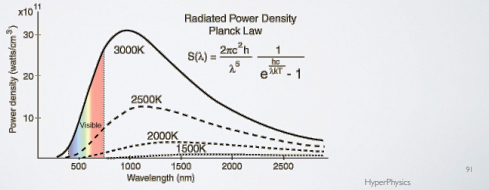
Black Body Radiation





HyperPhysics