Lecture 5: Human Visual System: **Spatial and Color Vision**

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CSC 292/572, Fall 2022 **Mobile Visual Computing**



Logistics

Written assignment 2 is up and is due Sept. 23 11:30 AM.

• Can work in groups of 2.

Grades of WA1/WA0 will be posted soon.



The Roadmap

Theoretical Preliminaries

Human Visual Systems

Color in Nature, Arts, & Tech (a.k.a., the birth, life, and death of light)

Digital Camera Imaging

Modeling and Rendering

Applications



Eye Anatomy Spatial Vision Color Vision Colorimetry

Color science is a vastly interesting and broad discipline. We can only covering the basics. Dig (slightly) deeper using our interactive tutorials: <u>https://www.cs.rochester.edu/courses/572/colorvis/</u>.



Red Without Any Red Pixel



https://www.vice.com/en/article/wnkq5n/this-picture-hasno-red-pixelsso-why-do-the-strawberr ies-still-look-red

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The Dress





The Dress



https://en.wikipedia.org/wiki/The_dress



Checker Shadow Illusion



https://en.wikipedia.org/wiki/Color_constancy 6



Checker Shadow Illusion





https://en.wikipedia.org/wiki/Color_constancy 6





Eye Anatomy







Human Eye Anatomy



Human Eye Anatomy

https://garetina.com/patient-education/about-the-eye/ 9

Blind Spot

Nerve fibers route before the retina in human eyes

Octopus



Human



Blind Spot: "See" It For Yourself

Test:

- Cover your LEFT eye and stare at the cross with your RIGHT eye.
- Slowly move towards the computer screen while still staring at the cross with your RIGHT eye.
- At some point the black circle will disappear.

Blind spot doesn't appear dark because your brain "makes stuff up"





https://visionaryeyecare.wordpress.com/2008/08/04/eye-test-find-your-blind-spot-in-each-eye/ 11

Photoreceptors: Cones and Rods

Cells that convert optical signals (lights) to electrical signals (voltage potentials), which then stimulate biological processes in your brain.



https://askabiologist.asu.edu/rods-and-cones 12



Photoreceptor Density Distribution

Uneven. The retina area with the highest cone density is called *fovea*.

Fovea angle is about 2°. Peripheral vision has very low acuity.







Foveated Rendering

PERIPHERAL



From Light to Visual Perception



Light

For the purpose of understanding color, we consider light as photons. Lights emit photons. Materials emit, absorb, and/or scatter photons. Each photon has energy, dictated by its frequency/wavelength.

Energy of a $\lambda = 500$ nm photon: ~4 x 10⁻³⁴ J

Energy of a $\lambda = 750$ nm photon: ~2.7 x 10⁻³⁴ J





Light Spectrum

Most light sources mix photons of different wavelengths.







https://www.shutterstock.com/video/clip-369937-prism---light-dispersion-seamless-loop-hd1080p





Spectral Power Distribution

SPD $\Phi(\lambda)$: the power distribution by wavelength. Unit is W/nm.



https://www.quora.com/Is-there-a-difference-between-sun-rays-and-normal-bulb-light 18



Spectral Light

- Single-wavelength (monochromatic) light are called spectral light. • SPDs of spectral lights are very narrow spikes.
 - Few natural lights are spectral lights. Lasers can generate spectral lights.





Cone Responses



"The Human Eye: Structure and Function", by Clyde W. Oyster (1999)

What Dictates Photon Absorption?

Electrical Signal (λ) Two factors that decide whether a photon is absorbed.

0	1
2	

What Dictates Photon Absorption?

Optical Signal (λ) Two factors that de 1. Which type of co

Electrical Signal (λ)

- Two factors that decide whether a photon is absorbed.
- 1. Which type of cone a photon hits?

0	1
2	

What Dictates Photon Absorption?



- 1. Which type of cone a photon hits?
- 2. What's the wavelength of the photon?

Electrical Signal (λ) Two factors that decide whether a photon is absorbed.

0	1
2	

Three Cone Types

Three types of cone exists

- Long (L), Medium (M), Short (S)
- At 10° fovea: ~63% L, ~31% M, ~6% S



David Williams, UR



The arrangement of the three cone classes in the living human eye

Austin Roorda*† & David R. Williams*

*Center for Visual Science, University of Rochester, Rochester, New York 14627, USA

Human colour vision depends on three classes of receptor, the short- (S), medium- (M), and long- (L) wavelength-sensitive cones. These cone classes are interleaved in a single mosaic so that, at each point in the retina, only a single class of cone samples the retinal image. As a consequence, observers with normal trichromatic colour vision are necessarily colour blind on a local spatial scale¹. The limits this places on vision depend on the relative numbers and arrangement of cones. Although the topography of human S cones is known^{2,3}, the human L- and Mcone submosaics have resisted analysis. Adaptive optics, a technique used to overcome blur in ground-based telescopes⁴, can also overcome blur in the eye, allowing the sharpest images ever taken of the living retina⁵. Here we combine adaptive optics and retinal densitometry⁶ to obtain what are, to our knowledge, the first images of the arrangement of S, M and L cones in the living human eye. The proportion of L to M cones is strikingly different in two male subjects, each of whom has normal colour vision. The





Figure 1 Images of the right eye of subject JW. The mosaic was illuminated with a 4-ms flash (1 degree diameter, \sim 0.3 µJ) through a 2-mm entrance pupil. Light of wavelength 550 nm was used to maximize absorptance by L- and M-cone photopigment. Images were obtained with a 6-mm exit pupil at a retinal eccentricity of one degree nasal from the foveal centre, which is located to the left of the image. For each retinal location, about 50 images taken over 5 days were averaged to increase the signal-to-noise ratio. Fixational eye movements translate the image from flash to flash, requiring registration with crosscorrelation before averaging. a, A registered sum of 61 images taken after a full bleach. b-d, Absorptance images of the patch of cones shown in a, defined as 1 minus the ratio of the absorptance of a dark-adapted or selectively bleached image to the absorptance of the corresponding fully bleached image. Images of fully bleached retina were obtained following exposure to 550-nm light (70-nm bandwidth, 37×10^6 troland-seconds). Images of dark-adapted retina were taken following 5 min of dark adaptation. b, The absorptance image of dark-adapted cones, revealing a sparse array of S cones which appear dark because of their low absorptance at 550 nm. c, d, Absorptance images following a 470-nm (c) and 650-nm (d) selective bleach. Bleaching energies were set by calculation and then modified empirically to achieve the maximum possible difference between Mand L-photopigment concentration. The absorptance images for both bleaching conditions have higher pigment density toward the fovea; this is caused by the increases in the length of the outer segment and in macular pigment, which reduce bleaching in the 470-nm condition. Scale bar represents 5 arcmin of visua angle.

🗱 © 1999 Macmillan Magazines Ltd

NATURE VOL 397 11 FEBRUARY 1999 www.nature.com







Absorption probability changes with wavelength, i.e., spectral sensitivity.



* What's shown here is not raw absorption spectra, but measured cone sensitivity, which is resulted from but not equivalent to absorption.



Different cone types have different spectral sensitivity peaks.





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• L/M/S cones have peak sensitivities at, informally, long, medium, and short wavelength, respectively.





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Informally, it tell us for 1 unit power of spectral light (single-wavelength light) at wavelength **x**, how much cone responses (**y**) is generated.





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 Sometimes called "Cone Fundamentals"





Invisible Light



"Invisible": Lights (electromagnetic waves) not interacting with cones cells.

https://commons.wikimedia.org/wiki/File:EM_spectrum.svg





Invisible Light

Sunlight has invisible components, which don't interact with retina photoreceptors, but interact with other kinds of cells.

 Case in point: skin cancer, where Ultra-Violet (UV) lights interact with skin cells.

Another example: Infra-Red (IR) cameras can "see" things we can't.

 They use materials that do interact with IR lights. More in the camera module.



https://en.wikipedia.org/wiki/Sunlight#/media/File:Solar_spectrum_en.svg http://www.psicorp.com/content/psis-applied-research-activities-0





A Mental Model of Photoreceptors



Each photoceptor is a bucket with a small area. It collects (absorbs) photons that fall within the area with **probability** that varies with wavelengths.

Univariance: once a photon is absorbed, the counter increments by 1, i.e., no difference between photons after absorption.

When a bucket is full (i.e., **saturated**), no photons are collected, and no neural signals are generated. The photoreceptor becomes insensitive to light. • Rods are saturated during daylight.



Spatial Vision



Retina = Low-Pass Filtering + Spatial Sampling








Retina



Low-Pass Filtering on Retina



Retina

Compare: convolving with a box filter, whose size is the size of a cone cell.





Low-Pass Filtering on Retina



Retina

Compare: convolving with a box filter, whose size is the size of a cone cell.



... Followed by 2D Sampling

Sample at each photoreceptor center



Retina



Retina is a Low-Pass Filter

- Each photoreceptor has an (small) area, which integrates photons.
- This is equivalent to a 2D box filter, whose width is the photoreceptor size.
- Photon detection is thus a two-step process:
 - Filtering the continuous 2D signal on the retina with a 2D box filter
 - Followed by a 2D sampling, one sample at each photoreceptor center

is equivalent to calculating the convolution only at the sampled points.

Integrating photons is equivalent because convolution followed by sampling













Frequency of signal in the scene: **1/P**





Frequency of signal in the scene: **1/P**

Frequency of signal on the retina (before sampling): D₁/(D₂ P)





Human Photoreceptor Topography, Curcio et al., 1990 https://www.pnas.org/content/116/16/7951 34





Human Photoreceptor Topography, Curcio et al., 1990 https://www.pnas.org/content/116/16/7951 34





Human Photoreceptor Topography, Curcio et al., 1990 https://www.pnas.org/content/116/16/7951 34



Retinal Sampling Rate



L ~= **2.5 µm** (at fovea) and $D_2 \sim = 16.7 \text{ mm}$ (data from Visual Ecology Ch 6, 2014).

2LP

 $2L/D_{2}$







https://www.dxomark.com/apple-iphone-12-pro-max-display-review-bigger-and-still-near-the-top/ https://www.dimensions.com/element/apple-iphone-12-pro-14th-gen 36



Super Retina XDR

display¹

Super Retina XDR display¹







Display alternative black and white pixels, basically use square wave to approximate sine wave.

The highest frequency that can be displayed on this device.



Super Retina XDR

display¹



6.5" iPhone 11 Pro

5.8"

Super Retina XDR display¹







• 1284 x 2778 pixels, 6.33 inch height

Display alternative black and white pixels, basically use square wave to approximate sine wave.

The highest frequency that can be displayed on this device.





6.5" iPhone 11 Pro

5.8"

Super Retina XDR display¹

display¹







• 1284 x 2778 pixels, 6.33 inch height • $\mathbf{P} = 2 (6.33'' / 2778)$

Display alternative black and white pixels, basically use square wave to approximate sine wave.

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6.5" iPhone 11 Pro

5.8"

Super Retina XDR display¹

display¹







- 1284 x 2778 pixels, 6.33 inch height
- $\mathbf{P} = 2 (6.33'' / 2778)$
- Viewing distance (**D**₁) 12 inches

Display alternative black and white pixels, basically use square wave to approximate sine wave.

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display¹







- 1284 x 2778 pixels, 6.33 inch height
- $\mathbf{P} = 2 (6.33'' / 2778)$
- Viewing distance (**D**₁) 12 inches
- $P/D_1 \sim = 0.00038$

Display alternative black and white pixels, basically use square wave to approximate sine wave.

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Super Retina XDR display¹

display¹







- 1284 x 2778 pixels, 6.33 inch height
- $\mathbf{P} = 2 (6.33'' / 2778)$
- Viewing distance (**D**₁) 12 inches
- $P/D_1 \sim = 0.00038$
- Just short of being "super retina"

Display alternative black and white pixels, basically use square wave to approximate sine wave.

The highest frequency that can be displayed on this device.





6.5" iPhone 11 Pro

5.8"

Super Retina XDR display¹

display¹





MacBook Air (Mid 2012) Example



- 1440 x 900 pixels, 8.94 inch height
- $\mathbf{P} = 2 (8.94'' / 900)$
- Viewing distance (**D**₁) 18 inches
- $P/D_1 \sim = 0.0011$
- Much lower spatial frequency. No where close to "retinal resolution".

Display alternative black and white pixels, basically use square wave to approximate sine wave.

The highest frequency that can be displayed on this device.



https://igotoffer.com/apple/macbook-air-5-2 37







Perceivable threshold

$$\frac{P}{D_1} > \frac{2L}{D_2}$$







Perceivable threshold



Increasing viewing distance reduces perceptibility, because the spatial frequency on the retina increases







Perceivable threshold

2L

- Increasing viewing distance reduces perceptibility, because the spatial frequency on the retina increases
- Decreasing view distance increases perceptibility until...



Period P (distance between peaks)



Perceivable threshold

2L

- Decreasing view distance increases perceptibility until... the object is too close and the lens lacks the optical power to focus
- Increasing viewing distance reduces perceptibility, because the spatial frequency on the retina increases





















$$L = \sum_{\substack{\lambda=380}}^{780} \Phi(\lambda) L(\lambda)$$

In practice both the SPD and the cone responses are given at discrete intervals.

$$L = \int_{\lambda} \Phi(\lambda) L(\lambda) d\lambda$$





Any light could be expressed as a <L, M, S> triplet.







https://en.wikipedia.org/wiki/CIE_1931_color_space

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Brain Receives Only the LMS Signals, not Light!

Eye





A color sensation!



https://www.eyeworld.org/research-finds-human-visual-cortex-continues-development-mid-30s 42



Brain Receives Only the LMS Signals, not Light!

Eye



A particular LMS combination leads to a particular color sensation.

A color sensation!

[L, M, S] Choroid Retina Signals Fovea centralis Optic disc (blind spot) **Blood vessels** Optic nerve



https://www.eyeworld.org/research-finds-human-visual-cortex-continues-development-mid-30s 42



Brain Receives Only the LMS Signals, not Light!



A particular LMS combination leads to a particular color sensation.

This is a huge dimensionality reduction: the light spectrum is a very high to only a three-dimensional vector!

A color sensation!

dimensional vector (numerous wavelengths), but is transformed by the retina

https://www.eyeworld.org/research-finds-human-visual-cortex-continues-development-mid-30s 42



Visualizing Spectral Lights in the LMS Color Space



Play with an interactive app here: https://www.cs.rochester.edu/courses/572/colorvis/cone2cmf.html





The LMS Color Space

By expressing any light's color as a <L, M, S> point, we have inherently defined a 3D color space, in which every color is a point.

See visualization here: <u>https://www.cs.rochester.edu/courses/572/colorvis/</u> <u>chromaticity.html</u>.

What if we uniformly double the power at each wavelength? How would the corresponding <L, M, S> change?


Two Fascinating Questions

1. Does any arbitrary point in the LMS space correspond to a color?

the LMS space?

- 2. Will there be multiple lights that correspond to the same point, i.e., color in



Recall: Calculating Total Cone Responses







Matrix Perspective



 $\begin{bmatrix} L_{380}, L_{381}, \cdots, L_{780} \\ M_{380}, M_{381}, \cdots, M_{780} \\ S_{380}, S_{381}, \cdots, S_{780} \end{bmatrix} \times \begin{bmatrix} \Phi_{380} \\ \Phi_{381} \\ \vdots \\ \Phi_{780} \end{bmatrix} = \begin{bmatrix} L \\ M \\ S \end{bmatrix}$



Matrix Perspective

It's an under-determined system of linear equations. **In general**, it has infinitely many solutions.

In general, there are infinitely many lights that correspond to the same color. This is called **metamerism**. More on this soon.

$$\begin{bmatrix} L_{380}, L_{381}, \dots, L_{780} \\ M_{380}, M_{381}, \dots, M_{780} \\ S_{380}, S_{381}, \dots, S_{780} \end{bmatrix} \times \begin{bmatrix} \Phi_{380} \\ \Phi_{381} \\ \vdots \\ \Phi_{780} \end{bmatrix} = \begin{bmatrix} L \\ M \\ S \end{bmatrix}$$

The first matrix is known. Given the [L, M, S] vector, can you solve for the Φ vector?



Matrix Perspective

It's an under-determined system of linear equations. **In general**, it has infinitely many solutions.

In general, there are infinitely many lights that correspond to the same color. This is called **metamerism**. More on this soon.

An additional constraint: Φ must all be nonnegative, since there is no negative power!

$$\begin{bmatrix} L_{380}, L_{381}, \cdots, L_{780} \\ M_{380}, M_{381}, \cdots, M_{780} \\ S_{380}, S_{381}, \cdots, S_{780} \end{bmatrix} \times \begin{bmatrix} \Phi_{380} \\ \Phi_{381} \\ \vdots \\ \Phi_{780} \end{bmatrix} = \begin{bmatrix} L \\ M \\ S \end{bmatrix}$$

The first matrix is known. Given the [L, M, S] vector, can you solve for the Φ vector?



But Can There Be No Solution?

One scenario: negative L, M, or S responses. All cone responses are physical quantities, which must be positive.

Another scenario: impossible cone response combinations.



Play with an interactive app here: <u>https://www.cs.rochester.edu/courses/572/colorvis/chromaticity.html</u>



Imaginary Color

An impossible cone combination still corresponds to a point ("color") in the LMS space. We call it an imaginary color. It's not a color that can be produced by physical lights; it requires negative power in the light spectrum.



Play with an interactive app here: <u>https://www.cs.rochester.edu/courses/572/colorvis/chromaticity.html</u>





Color Gamut of Human Visual System (HVS)

HVS Color Gamut: the set of all the colors that human can see.

The HVS color gamut encapsulates all the LMS points for which the system of linear equations below has a non-negative solution.

$$\begin{bmatrix} L_{380}, L_{381}, \dots, L_{780} \\ M_{380}, M_{381}, \dots, M_{780} \\ S_{380}, S_{381}, \dots, S_{780} \end{bmatrix} \times \begin{bmatrix} \Phi_{380} \\ \Phi_{381} \\ \vdots \\ \Phi_{780} \end{bmatrix} = \begin{bmatrix} L \\ M \\ S \end{bmatrix}$$



Two Fascinating Questions

1. Does any arbitrary point in the LMS space correspond to a color?

• No

2. Will there be multiple lights that correspond to the same point, i.e., color in the LMS space?

• Yes. In fact, there are infinitely many.





Intuition



same "color", even if their spectra might be totally different!

...because retinal processing is a dramatic dimensionality reduction.

Lights that produce the same LMS signals are *perceived* by the brain as the

https://www.eyeworld.org/research-finds-human-visual-cortex-continues-development-mid-30s 54

















$$\sum_{\lambda} \Phi_{1}(\lambda)L(\lambda) = \sum_{\lambda} \Phi_{2}(\lambda)L(\lambda)$$
$$\sum_{\lambda} \Phi_{1}(\lambda)M(\lambda) = \sum_{\lambda} \Phi_{2}(\lambda)M(\lambda)$$
$$\sum_{\lambda} \Phi_{1}(\lambda)S(\lambda) = \sum_{\lambda} \Phi_{2}(\lambda)S(\lambda)$$





Does metamerism exist? That is, given a spectrum Φ , can we always find at least one Φ' that is the metamer of Φ ? Can we find multiple?



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not known until early 20th century.

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- The answer is yes. We showed earlier how to find metamers by solving system of linear equations. But that requires knowing L(λ), M(λ), and S(λ), which were



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a clever color matching experiment.

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But people were able to find metamers as early as late 19th century, through



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a clever **color matching** experiment.

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Studying color matching experiment will provide us with immense insights.



You are given three monochromatic (spectral) lights with known spectra pointing to the same point.

• They are call the primary lights.



(1809 - 1877)



Target light

Color matching experiment; circa 1835

Primary lights



You are given three monochromatic (spectral) lights with known spectra pointing to the same point.

• They are call the primary lights.

You are also given a target light with unknown spectrum.



(1809 - 1877)



Target light

Color matching experiment; circa 1835

Primary lights



You are given three monochromatic (spectral) lights with known spectra pointing to the same point.

• They are call the primary lights.

You are also given a target light with unknown spectrum.

Tune each primary light's power so that the color of the primary light mix matches the color of the target light.



(1809 - 1877)



Target light

Color matching experiment; circa 1835

Primary lights



The three primary lights used in CIE 1931 standard: λ =435.8 nm, 546.1 nm, 700 nm; roughly blue, green, and red.

CIE 1931 limited viewing angle to be 2° so that only the fovea gets light.

It swept all the spectral lights in the visible spectrum as the target light (at a 5-nm interval).











For **one unit power** of each target light, how many units of each primary light are needed to match the color.



CIE 1931 2° RGB Color Matching Functions





For **one unit power** of each target light, how many units of each primary light are needed to match the color.



CIE 1931 2° RGB Color Matching Functions





For **one unit power** of each target light, how many units of each primary light are needed to match the color.

If the target light λ has a power of Φ_{580} , the amounts of the primary lights we need are: $\Phi_{580} \times R_{580}, \Phi_{580} \times G_{580}, \Phi_{580} \times B_{580}$



CIE 1931 2° RGB Color Matching Functions





For **one unit power** of each target light, how many units of each primary light are needed to match the color.

The RGB values of a target color are called the tristimulus values of the color in the CIE 1931 RGB color space.

If the target light λ has a power of Φ_{580} , the amounts of the primary lights we need are: $\Phi_{580} \times R_{580}, \Phi_{580} \times G_{580}, \Phi_{580} \times B_{580}$



CIE 1931 2° RGB Color Matching Functions





Spectral Locus in the CIE 1931 RGB Space



Spectral locus in CIE 1931 RGB



CIE 1931 2° RGB Color Matching Functions





Expressing Arbitrary Light Using CMFs

How much total R, G, and B needed to match the color of an arbitrary light Φ ?

Calculate it wavelength-by-wavelength and sum it up.

$$R = \sum_{\lambda} \Phi(\lambda) \bar{r}(\lambda)$$
$$G = \sum_{\lambda} \Phi(\lambda) \bar{g}(\lambda)$$
$$B = \sum_{\lambda} \Phi(\lambda) \bar{b}(\lambda)$$



CIE 1931 2° RGB Color Matching Functions















No combination of RGB matches the target light, but adding some R with the target light matches the color of some combination of G and B.

Color of light $\lambda = 540$ nm can't be reproduced by R, G, B. Doesn't mean λ =540 nm doesn't exist; it just can't be generated from the three chose primary lights. More later (gamut).







How To Explain Color Matching Experiments?

Why do color matching experiments work? Can we explain that?







How To Explain Color Matching Experiments?

Why do color matching experiments work? Can we explain that?

Given a target light $\Phi(\lambda)$ and the primary lights, can we calculate the tristimulus values for $\Phi(\lambda)$ without the color matching experiment?







How To Explain Color Matching Experiments?

Why do color matching experiments work? Can we explain that?

Given a target light $\Phi(\lambda)$ and the primary lights, can we calculate the tristimulus values for $\Phi(\lambda)$ without the color matching experiment?

Key: the total L, M and S cone responses of the three primary lights must match the total cone responses of the target light.






Intuition

L cone response of target light = L cone response of primary R + L cone response of primary G + L cone response of primary B

M cone response of target light = M cone response of primary R + M cone response of primary G

S cone response of target light = S cone response of primary R + S cone response of primary G + S cone response of primary B

+ M cone response of primary B



Matching L Cone Responses



 $= \sum \Phi(\lambda) L(\lambda)$

The L cone response of the target light







Matching L Cone Responses

$\sum G(\lambda)L(\lambda)$ $\sum R(\lambda)L(\lambda)$ Amount of L cone responses of one unit of each primary light

 $\sum B(\lambda)L(\lambda)$ $= \sum_{\lambda} \Phi(\lambda) L(\lambda)$ The L cone response

of the target light







Matching L Cone Responses

$\sum R(\lambda)L(\lambda) \times r + \sum G(\lambda)L(\lambda) \times$ Amount of L cone response unit of each primary li

$$\left\langle \begin{array}{c} g \\ g \\ \end{array} + \sum B(\lambda)L(\lambda) \times \begin{array}{c} b \\ \end{array} \right\rangle = \sum \Phi(\lambda)L(\lambda)$$
es of one
ight The L cone response
of the target light











Matching All Cone Responses

 $\sum R(\lambda)L(\lambda) \times r + \sum G(\lambda)L(\lambda) \times r$ $\sum R(\lambda)M(\lambda) \times r + \sum G(\lambda)M(\lambda) \times r$ $\sum R(\lambda)S(\lambda) \times r + \sum G(\lambda)S(\lambda) \times r$

$$\langle g + \sum B(\lambda)L(\lambda) \times b = \sum \Phi(\lambda)L(\lambda)$$

$$\langle g + \sum B(\lambda)M(\lambda) \times b = \sum \Phi(\lambda)M(\lambda)$$

$$\langle g + \sum B(\lambda)S(\lambda) \times b = \sum \Phi(\lambda)S(\lambda)$$







Equivalent to Solving a System of Linear Equations

Equivalent to solving the system of linear equations with 3 equations and 3 variables (**r**, **g**, **b**). The system has a unique solution (generally).

 $\begin{bmatrix} \sum R(\lambda)L(\lambda) & \sum G(\lambda)L(\lambda) & \sum I \\ \sum R(\lambda)M(\lambda) & \sum G(\lambda)M(\lambda) & \sum I \\ \sum R(\lambda)S(\lambda) & \sum G(\lambda)S(\lambda) & \sum I \end{bmatrix}$

$B(\lambda)L(\lambda)$		$\lceil r \rceil$		$\sum \Phi(\lambda) L(\lambda)$
$B(\lambda)M(\lambda)$	X	g	=	$\sum \Phi(\lambda) M(\lambda)$
$B(\lambda)S(\lambda)$		$\lfloor b \rfloor$		$\sum \Phi(\lambda) S(\lambda)$



Why Three Primary Colors?

three equations, which generally doesn't have a solution, i.e., no way of finding a match, generally. Over-determined system.

More than three primaries: more variables than equations, so there are Under-determined system.

- If only two primary colors, the system of equations has **two** variables with
- infinitely many ways of combining the primary lights to match the target color.



Trichromatic Theory of Color



Conjectured by Thomas Young as early as 1801, and expanded by Helmholtz and Maxwell in 1860.

- Color matching experiments empirically verified it.
- Experimental measurement of cone sensitivities much later.

Target light Pervasive applications:

- Color reproduction chain: display, print
- Capture color: camera



A Note on "RGB"

There is no one single definition of "red", "green", and "blue".

chosen that they look red, green, and blue.

Primary lights don't have to be monochromatic spectral lights.



380nm

- Usually "RGB" is just synonyms for "primary lights", which usually are so

A RGB Color Space

have a color space.

• What this means is that the color of any arbitrary light $\Phi(\lambda)$ can be expressed as a point in that 3D coordinate system.

That is, we can mathematically study colors now — colorimetry.

 $\begin{bmatrix} \sum R(\lambda)L(\lambda) & \sum G(\lambda)L(\lambda) & \sum B(\lambda)L(\lambda) \\ \sum R(\lambda)M(\lambda) & \sum G(\lambda)M(\lambda) & \sum B(\lambda)M(\lambda) \\ \sum R(\lambda)S(\lambda) & \sum G(\lambda)S(\lambda) & \sum B(\lambda)S(\lambda) \end{bmatrix} \times \begin{bmatrix} r \\ g \\ b \end{bmatrix} = \begin{bmatrix} \sum \Phi(\lambda)L(\lambda) \\ \sum \Phi(\lambda)L(\lambda) \\ \sum \Phi(\lambda)M(\lambda) \\ \sum \Phi(\lambda)S(\lambda) \end{bmatrix}$

Given the exact spectra of the "RGB" primary lights R(λ), G(λ), and B(λ), we





So far we've seen two ways to express a color in a 3D space:

 $\begin{bmatrix} \sum \Phi(\lambda) L(\lambda) \\ \sum \Phi(\lambda) M(\lambda) \end{bmatrix} = \begin{bmatrix} l \\ m \end{bmatrix}$





- So far we've seen two ways to express a color in a 3D space:
 - A color can be expressed as its three cone responses (I, m, s)

 $\begin{vmatrix} \sum \Phi(\lambda) L(\lambda) \\ \sum \Phi(\lambda) M(\lambda) \end{vmatrix} = \begin{vmatrix} l \\ m \end{vmatrix}$





So far we've seen two ways to express a color in a 3D space:

- A color can be expressed as its three cone responses (I, m, s)
- A color can also be expressed as the amount of primary lights (r, g, b) needed





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How are the two expressions related?







Expressing a color from the [l, m, s] coordinates to the [r, g, b] coordinates is a geometric transformation.

Or equivalently, it's a transformation of the coordinate systems (color spaces)! • Because the transformation matrix is constant, metamers in RGB space are metamers in LMS space too.

Transformation matrix from the RGB space to the LMS space







CIE 1931 RGB <---> LMS Spaces

Spectral lights in the CIE 1931 RGB space



Spectral lights in the LMS space





Color Deficiency & Color Perception in Animals



Color Deficiency

Normal vision is trichromatic; that is, there are three kinds of cone cells.

Color blindness: one or two kinds of cone cells are missing.

Dichromat: missing one cone type

- Protanopia: missing L cones
- Deuteranopia: missing M cones
- Tritanopia: missing S cones.



Fovea cone cell distribution in a trichromat vision. Fovea cone cell distribution of a **Protanopia** vision, where **L** cones are missing.

https://en.wikipedia.org/wiki/Photoreceptor_cell 78



And with three, we enjoy trichromacy:



Slide credit: Andrew Stockman 79





With two, we are dichromatic:

Tritanopia (missing blue sensor)



Simulations from Sharpe, Stockman, Jägle & Nathans, 1999

Protanopia (missing red sensor)



Deuteranopia (missing green sensor)



Slide credit: Andrew Stockman⁸⁰





Thus, if we had only one photoreceptor, we would be colour-blind...



Examples: night vision (rod achromatopsia) Slide credit: Andrew Stockman⁸¹





Line of Confusion

For a protanope (which lacks L cones), all the colors that have the same M and S cone responses but **differ in L** would be perceived as the same color.

All the colors on a line parallel to the L-axis are seen as the same color by a protanope.

- C1~C4 are seen as the same color
- C5~C8 are seen as the same, but another color But which color on a line of confusion does a protanope actually see?



* This is an orthographic projection



Isochromes From Unilateral Dichromats

Isochromes: colors that even a dichromat can correctly perceive.

never describe/tell one's color sensation.

identify isochromes.

It's believed/hypothesized that all isochromes live on the same plane.

- Typically it's impossible to know which colors are isochromes, since one can
- Fortunately, there are extremely rare people who are unilateral dichromats: their one eye has trichromatic vision and the other eye is dichromatic. Color matching between the two eyes by a unilateral dichromat would allow us to



Isochromes From Unilateral Dichromats

RED-GREEN BLINDNESS CONFINED TO ONE EYE

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(Received 10 September 1975; accepted 15 September 1975)

Abstract—We report experimental studies of an individual with different types of color vision in his two eyes. The left eye is typically deuteranomalous, with good wavelength discrimination. The right eye is typically deuteranopic, both in its wavelength discrimination and in its color matching functions. Luminosity curves of left and right eyes are indistinguishable, both being within the normal range. Binocular matches show that the colors seen with the dichromatic eye range from "orange" (610 nm) at long wavelengths to "greenish blue" (473 or 474 nm) at short wavelengths. Possible physiological and genetic mechanisms are discussed.

INTRODUCTION

The nature of the link between deuteranopia and normal color vision has been a central problem in color theory for more than a hundred years, and many experiments have attempted to clarify it. Thanks to the investigations of Pitt (1935) and others, reviewed by Holmgren (1881) and discussed more recently by Walls and Mathews (1952). Both von Hippel and Holmgren found evidence of substantially reduced sensitivity to long wavelengths in the red-green blind eye, so this observer was probably a unilateral protanope. A second case of unilateral red-green blindness possibly concentral was reported by yop



<u>Peter Lennie</u>, UR



The Geometry of a Dichromatic Vision

See the visualization here: <u>https://</u> <u>www.cs.rochester.edu/courses/</u> 572/colorvis/colorblind.html.

Intercept the lines of confusion with the plane of isochromes.

Based on <u>Brettel et al. (1997)</u>.

- It actually used two planes.
- Widely cited but also challenged.







Bee Photoreceptor Sensitivities



Bees have three photoreceptors, but their sensitivities are shifted toward lower wavelengths.

So they can see UV lights but can't distinguish between red and black.



Bee Photoreceptor Sensitivities



Karl von Frisch (Nobel laureate, 1973)

Bees have three photorece their sensitivities are shifted lower wavelengths.

So they can see UV lights but can't distinguish between red and black.

Karl von Frisch, one of the first to experimentally show bees see color.

Animal Eyes, Land and Nilsson





Mantis Shrimp





https://www.science.org/doi/full/10.1126/science.1245824 87





Human Tetrachromacy



The dimensionality of color vision in carriers of anomalous trichromacy

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Some 12% of women are carriers of the mild, X-linked forms of color vision deficiencies called "anomalous trichromacy." Owing to random X chromosome inactivation, their retinae must contain four classes of cone rather than the normal three; and it has previously been speculated that these female carriers might be tetrachromatic, capable of discriminating spectral stimuli that are indistinguishable to the normal trichromat. However, the existing evidence is sparse and inconclusive. Here, we address the question using (a) a forced-choice version of the Rayleigh test, (b) a test using multidimensional scaling to reveal directly the dimensionality of the participants' color space, and (c) molecular genetic analyses to estimate the X-linked cone peak sensitivities of a selected sample of strong candidates for tetrachromacy. Our results suggest that most carriers of color anomaly do not exhibit four-dimensional color vision, and so we believe that anomalous trichromacy is unlikely to be maintained by an advantage to the carriers in discriminating colors. However, 1 of 24 obligate carriers of deuteranomaly exhibited tetrachromatic behavior on all our tests; this participant has three well-separated cone photopigments in the longwave spectral region in addition to her short-wave cone. We assess the likelihood that behavioral tetrachromacy exists in the human population.





Luminous Efficiency



Luminous Efficiency Function

Informally, quantifies the overall cone responses under different wavelengths.

- Given 1 Watt of light at a wavelength, how much cone response is generated?
- Experimentally measured and then fit as a weighted sum of the three individual cone sensitivity functions.

Human eyes under daylight (photopic vision) are most sensitive to green-ish light (LEF peaks at 555 nm).



http://cvrl.ioo.ucl.ac.uk/database/text/lum/CIE2008v2.htm 90





Luminous Efficiency Function

- If two spectral light λ =590 (green-ish) and λ =490 (blue-ish) have the **same power**, the former would look brighter
 - because cones are more sensitive to 590 nm than to 490 nm.

If luminous efficiency is, say, 0.8, it means 1 Watt of spectral light is translated to 0.8 Watt of "**perceived**" power.



CIE 2008 Photoptic LEF







Luminous Flux

How would we calculate the "perceived" power of an arbitrary light?



CIE 2008 Photoptic LEF







Luminous Flux

$$Y = 683 \frac{lm}{W} \int \Phi(\lambda) V(\lambda) d\lambda$$

How would we calculate the "perceived" power of an arbitrary light?



CIE 2008 Photoptic LEF






Luminous Flux

$$Y = 683 \frac{lm}{W} \int \Phi(\lambda) V(\lambda) d\lambda$$

How would we calculate the "perceived" power of an arbitrary light?

Luminous flux's unit is **lumen** (lm).

• Spectral light λ =555 nm emitting 1/683 W power generates 1 lumen.



CIE 2008 Photoptic LEF







Matching Brightness

If light A's luminous flux is, say, 5X higher than that of light B, we can match light A's brightness by increasing the power of light B by 5X.

Critically, this does NOT mean light A is five times brighter than light B!



CIE 2008 Photoptic LEF



Power vs. Luminous Flux

Lume



https://uvebtech.com/articles/2018/why-is-there-no-standard-unit-similar-to-lighting-products-for-the-radiant-output-of-uv-lamps/ 94

n	250+	450+	800+	1100+	
	25W	40W	60W	75W	100W
	18W	29W	43W	53W	72W
	6W	10W	13W	18W	23W
	4W	5W	10W	15W	20W





Power vs. Luminous Flux

Lume



https://uvebtech.com/articles/2018/why-is-there-no-standard-unit-similar-to-lighting-products-for-the-radiant-output-of-uv-lamps/ 94

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