

How wavelength starts to become color

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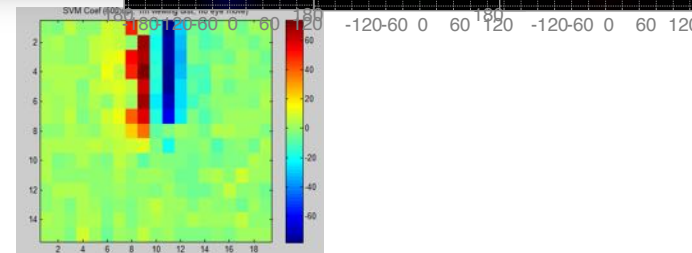
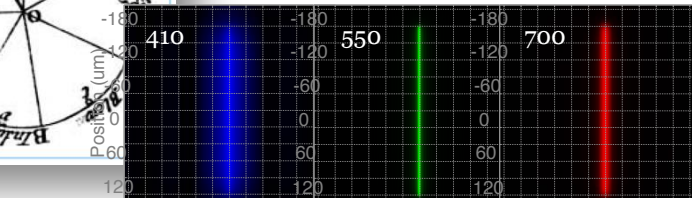
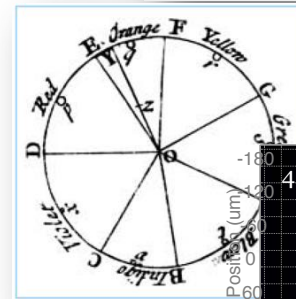
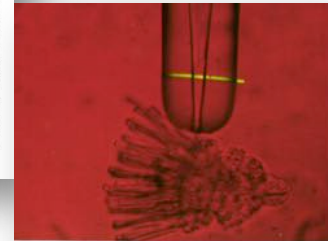
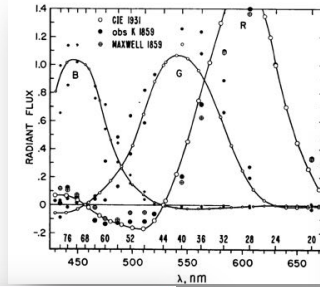
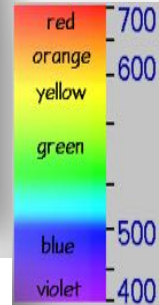






In 90 minutes today

- Primate optics, retina, fovea
- Light
- Color matching experiment
- Color matching equations
- Cone physiology
- Historical notes
- ISETBIO – computation



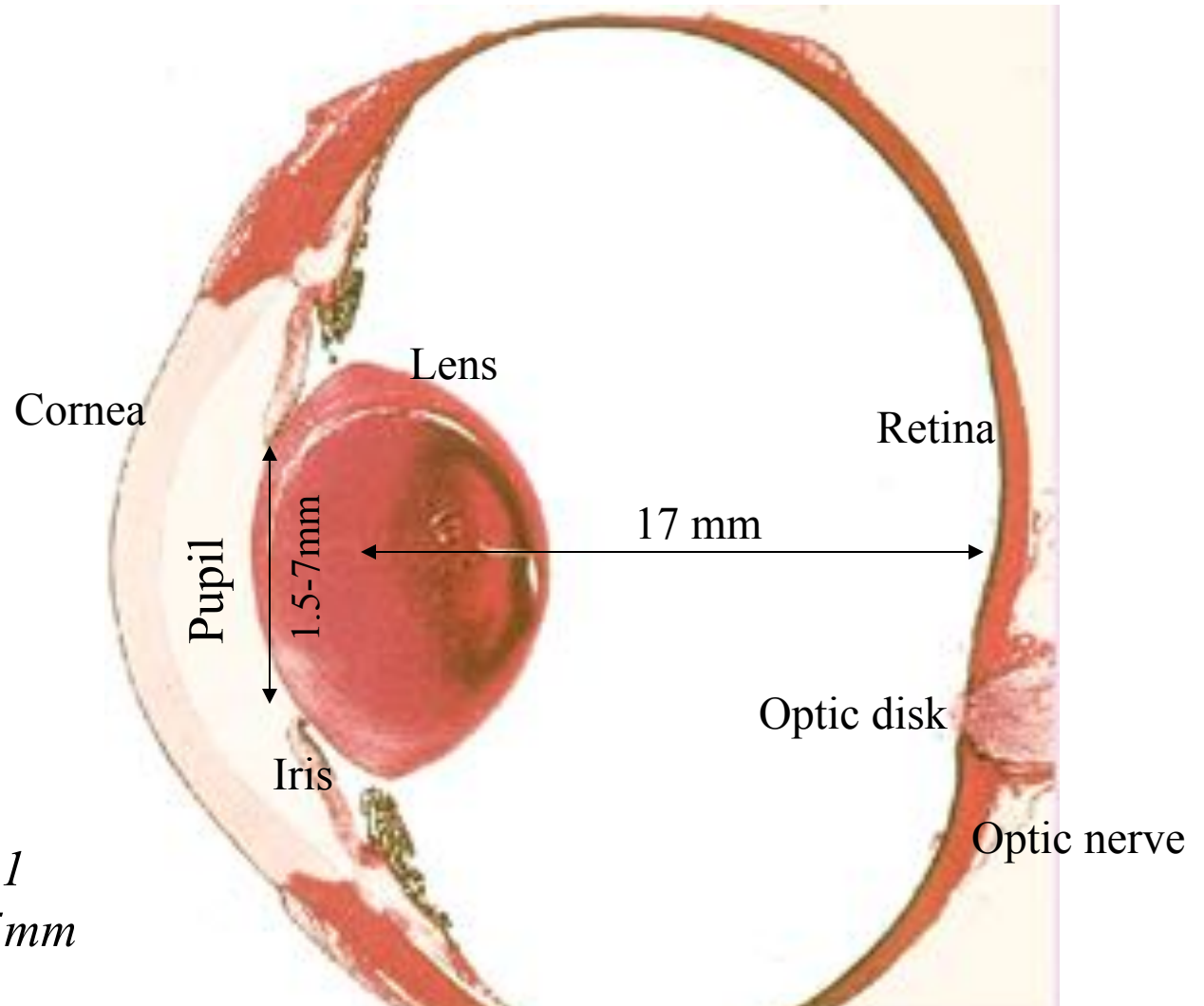
Color-matching is crucial to the display industry



Primate optics, retina and fovea



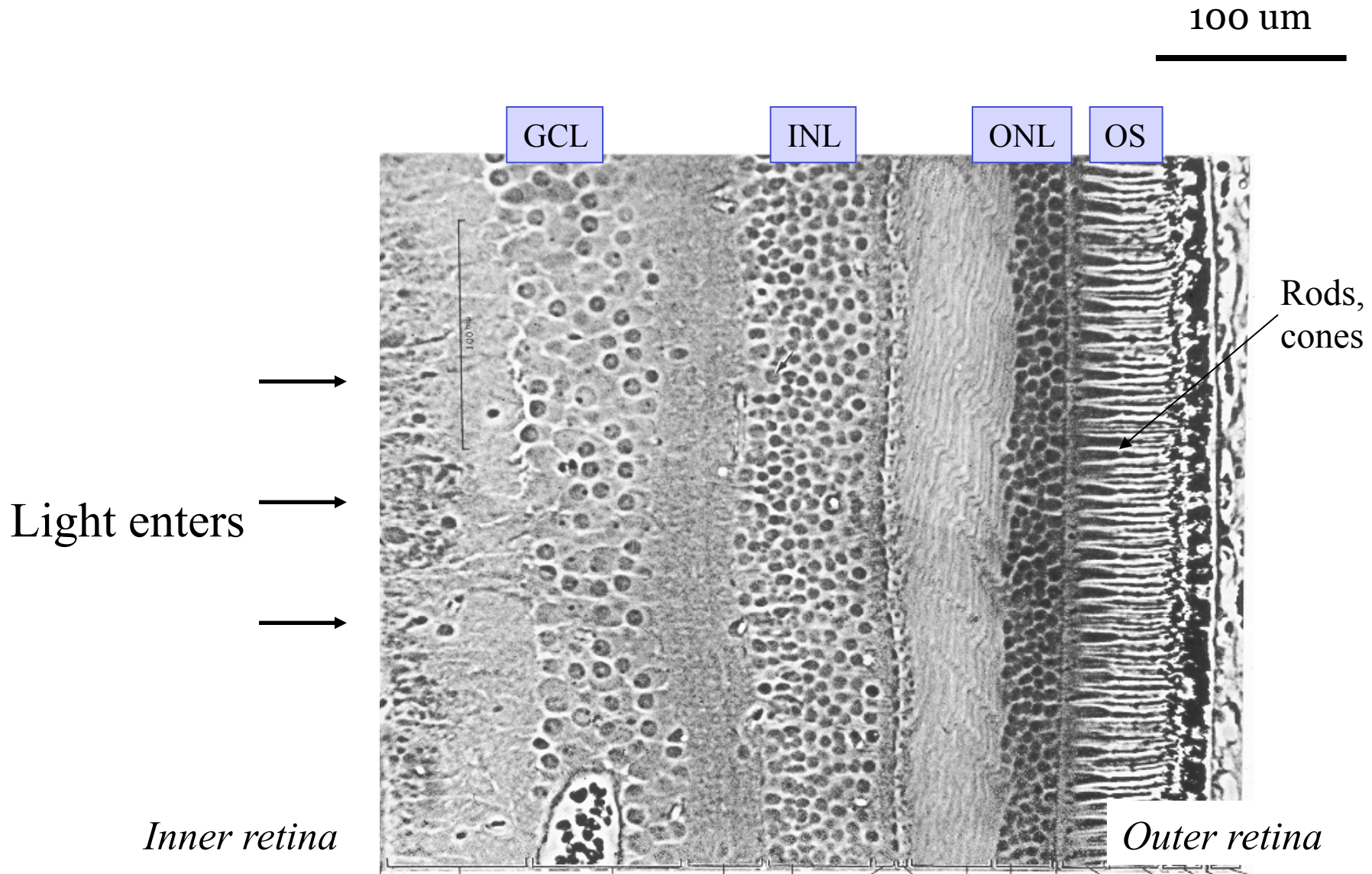
Human eye in cross- Section



F-number (f/a) $\sim 2.4-11$

Retinal thickness $\sim 0.5\text{ mm}$

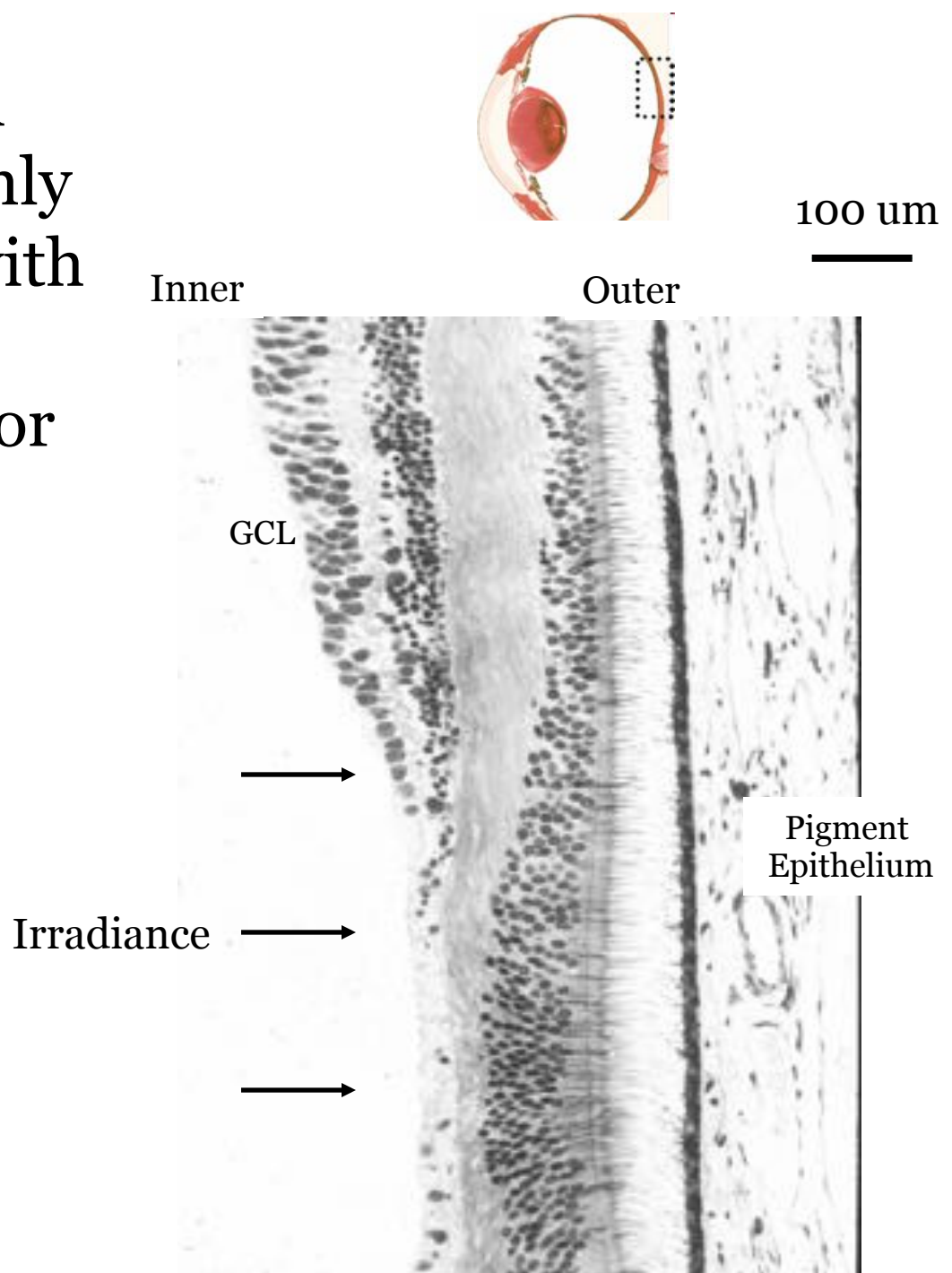
Light passes through the retinal cells and a fraction is absorbed by the rod and cone photopigments



The primate central fovea (pit) contains only cones and combines with the eye movement system to specialize for acuity and color

The Retina

- 5 x 5 cm, 0.4 mm thick
- 5×10^6 cones
- 10^8 rods
- Foveal cone width: 1 μ m
- Contacts per cone: 250
- 10^6 optic nerve fibers

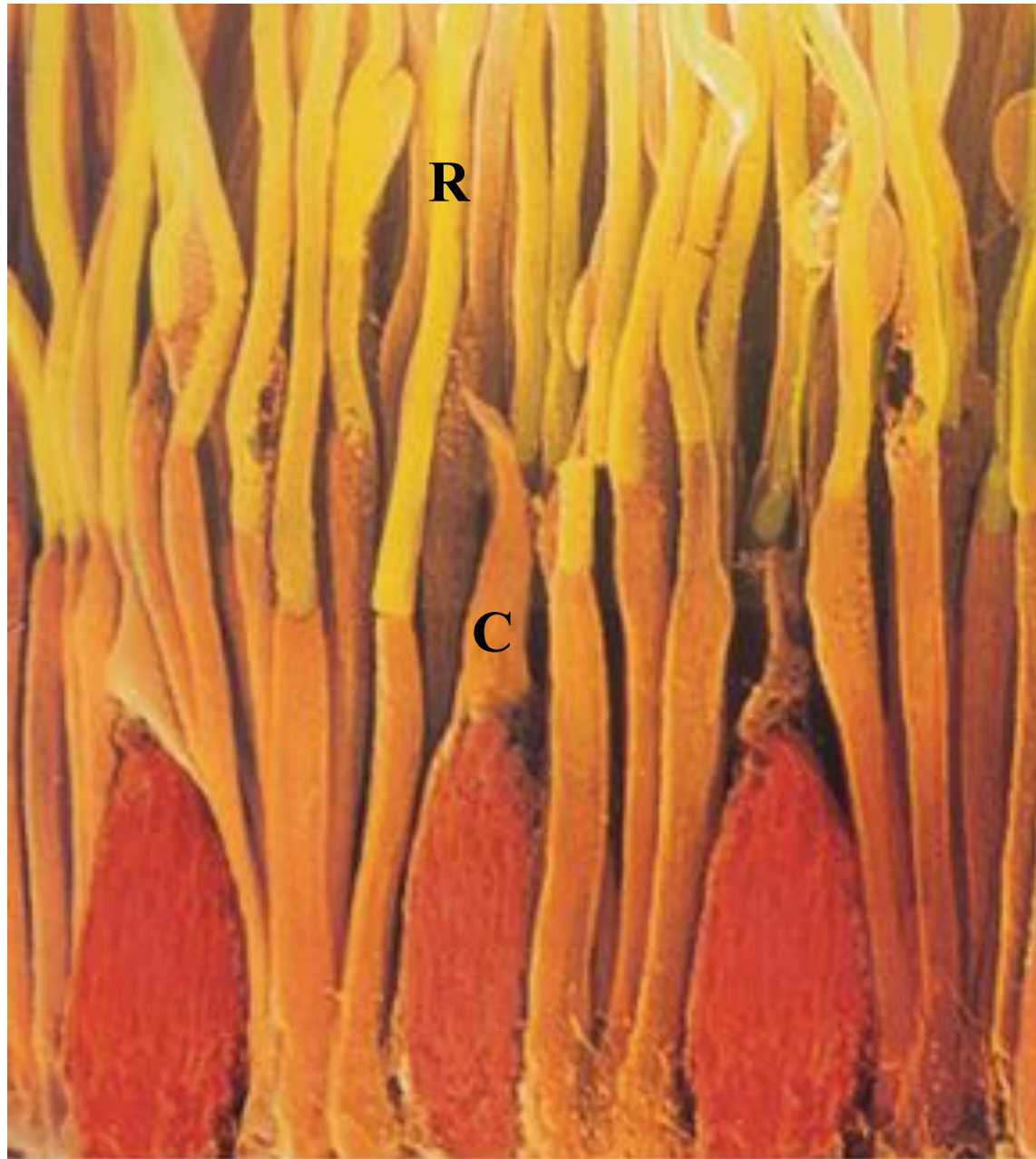


Rods and Cones

Outer
segments

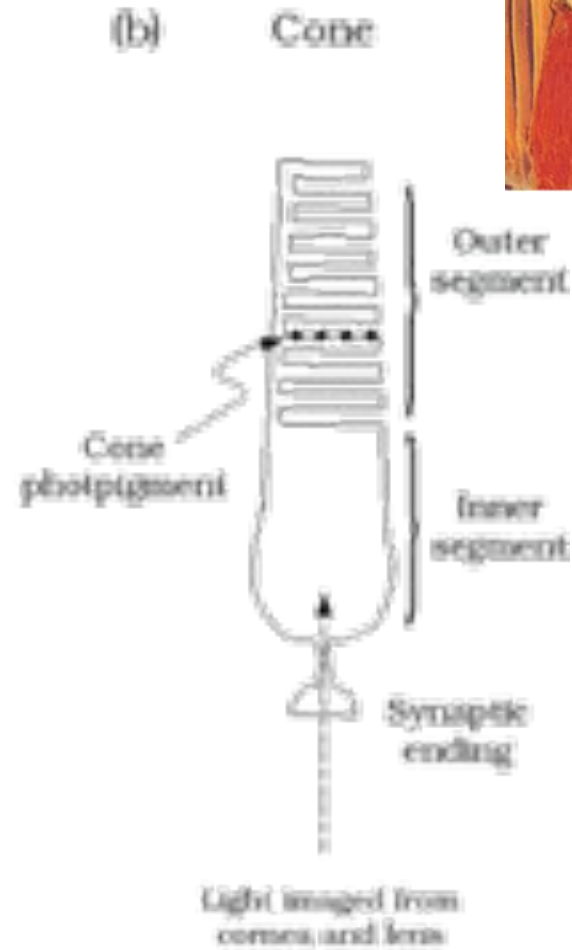
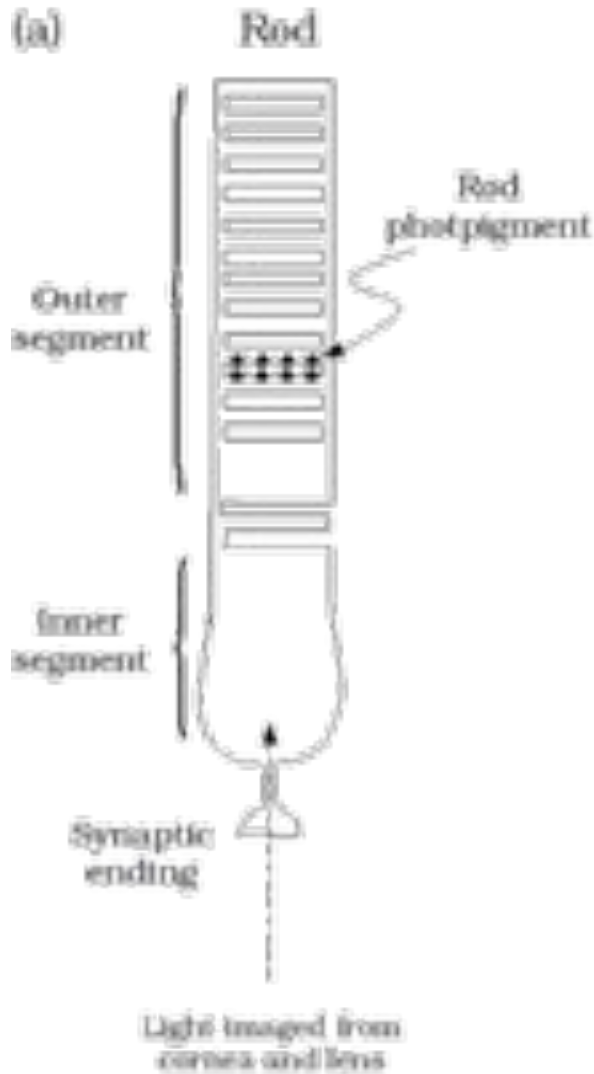
*Rods and cones
imaged by a
scanning electron
microscope. Each
rod is about one
micron cross-section.*

Inner
segments

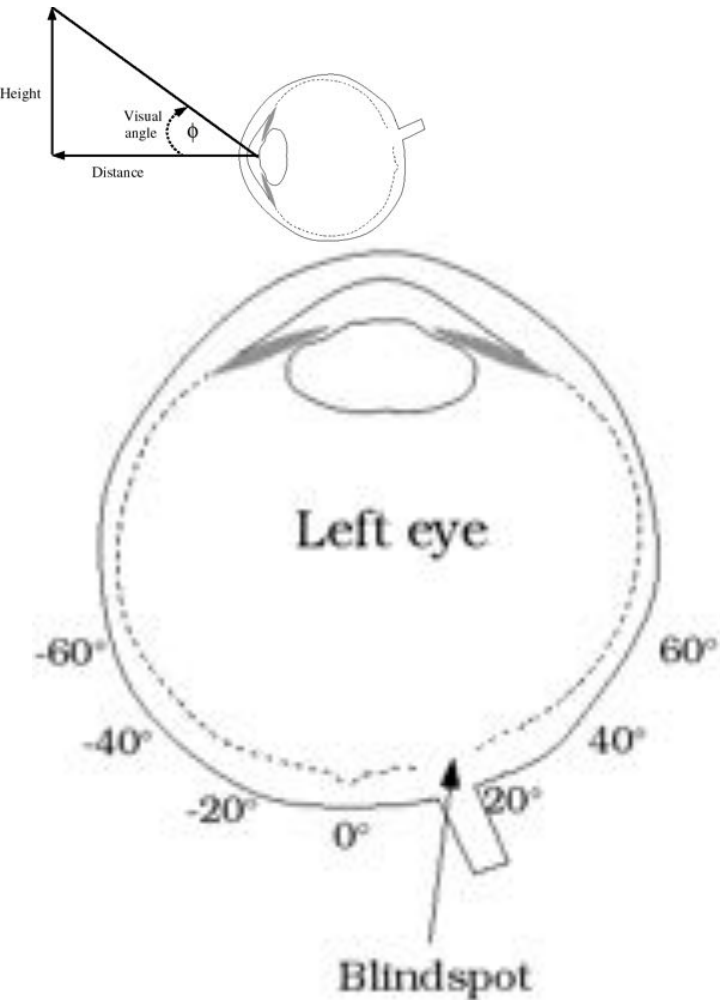


Receptor schematics

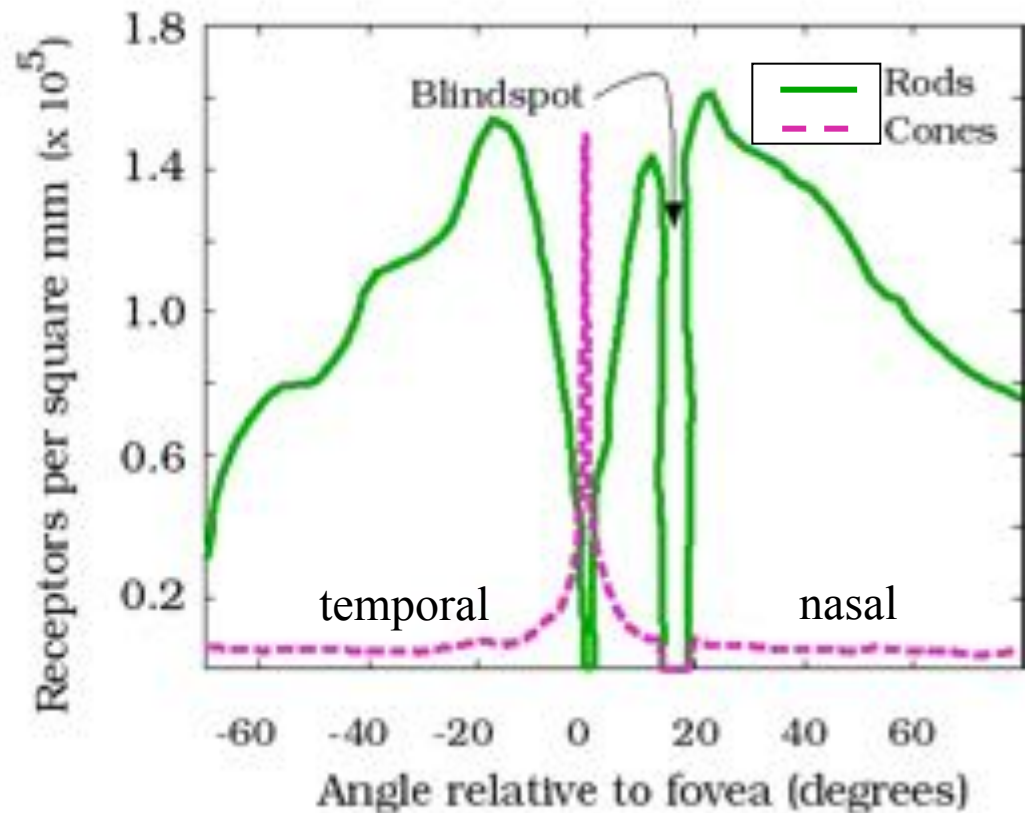
(Baylor, Proctor lecture, 1987)



Spatial distribution of human photoreceptors (rods and cones)



(b)



The unbleached rod photopigment, rhodopsin, can be seen in the living eye



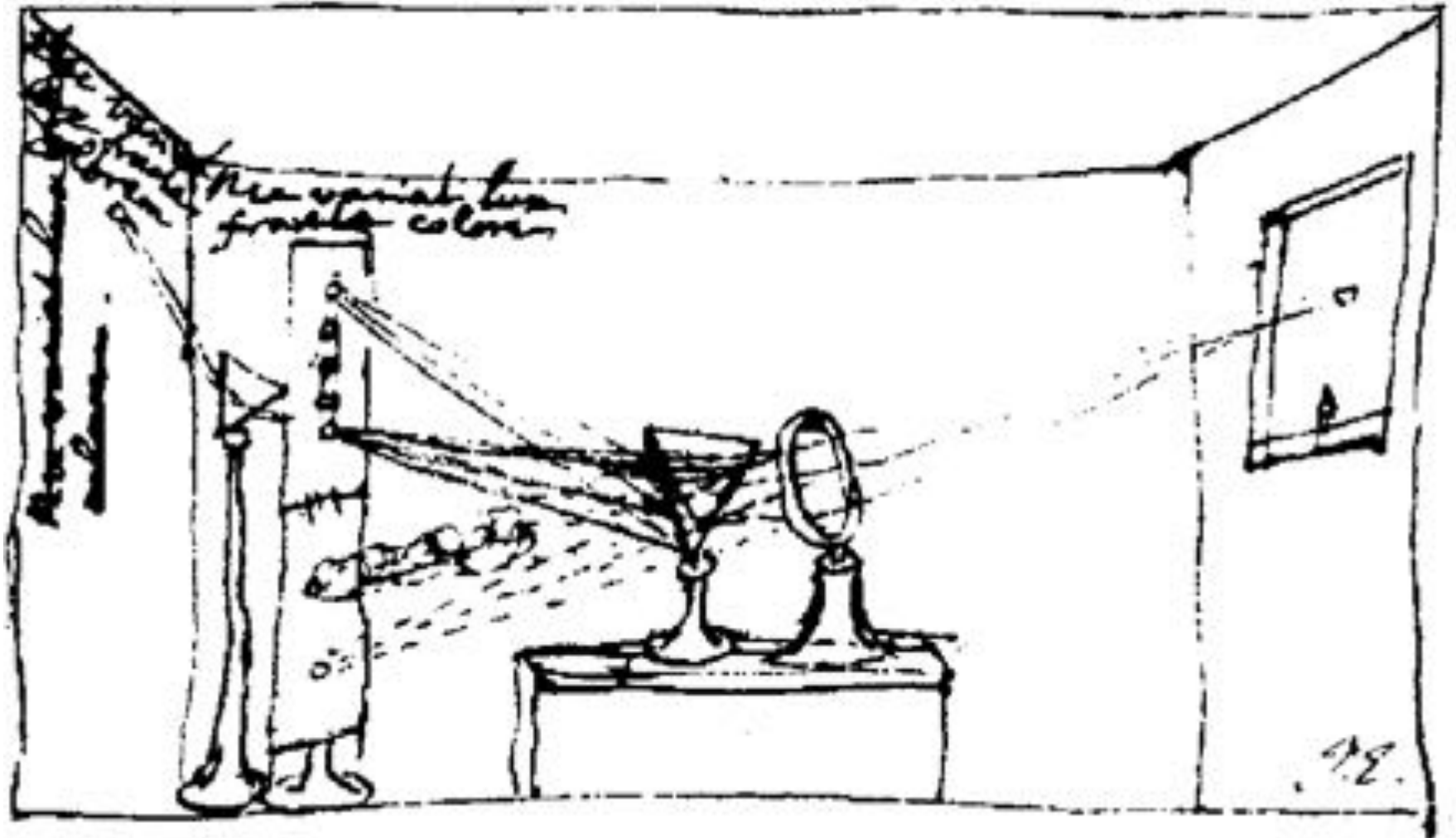
After exposure to light, the pigment becomes transparent



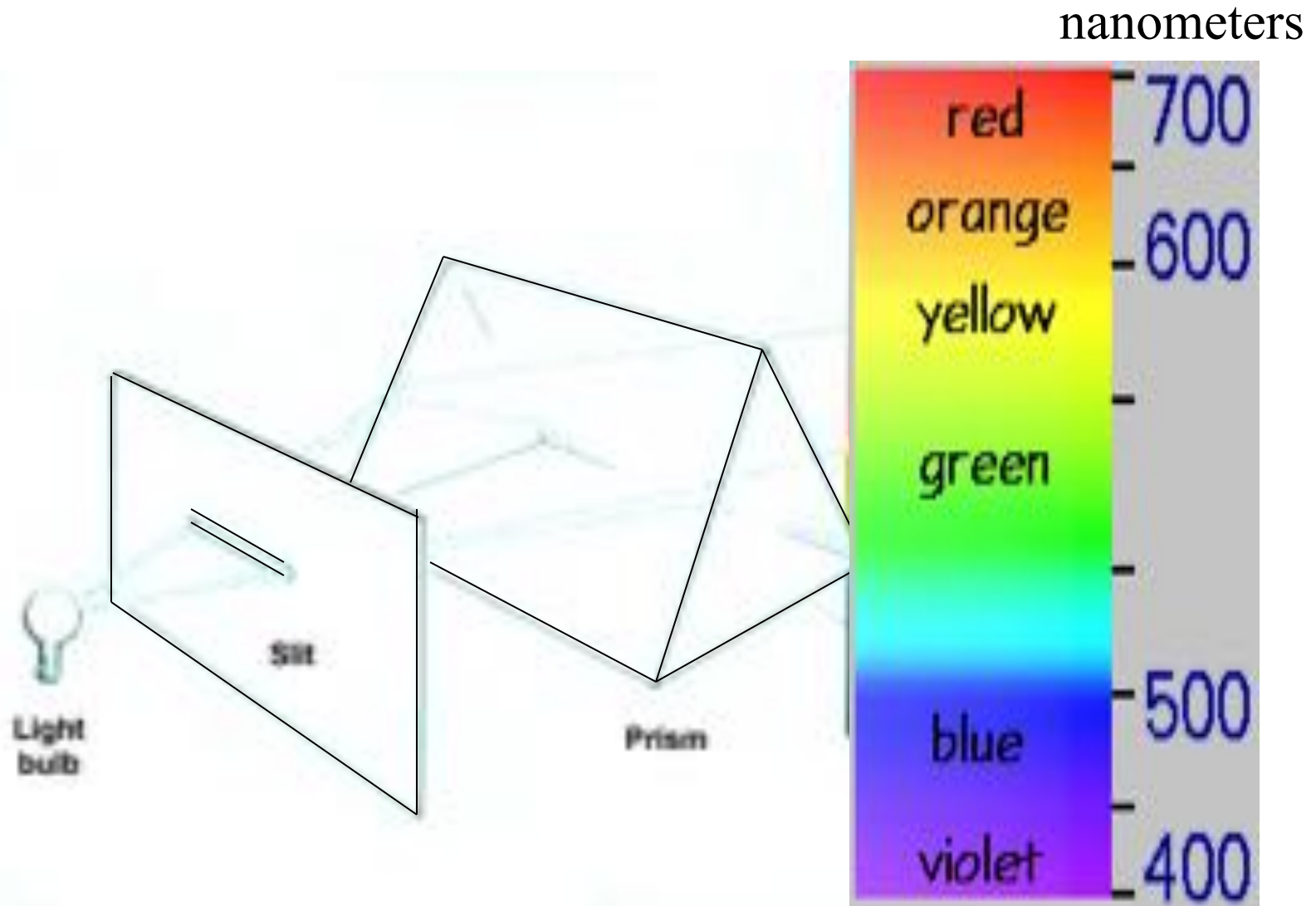
Light - Spectral radiance of uniform fields



The fundamental components of light



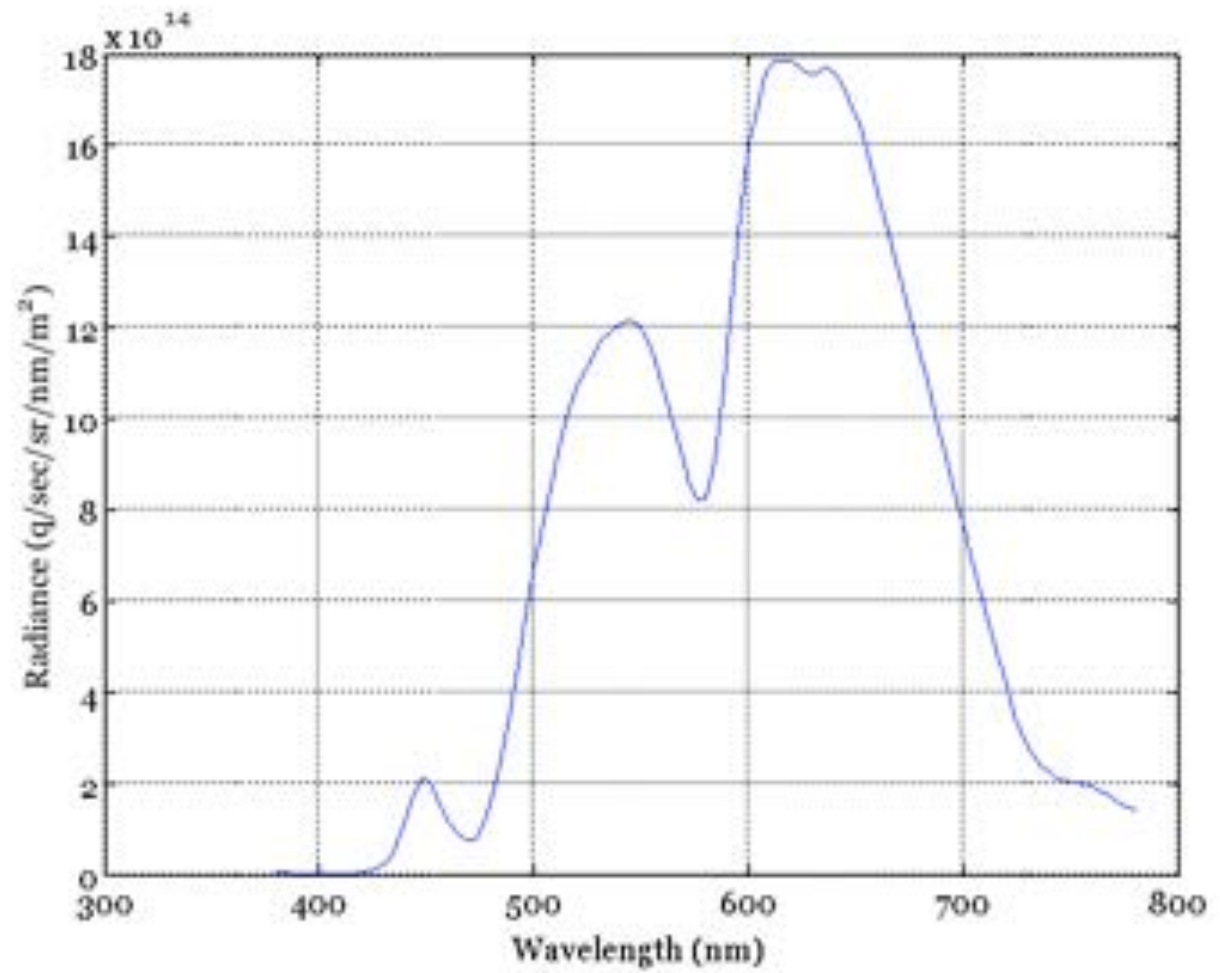
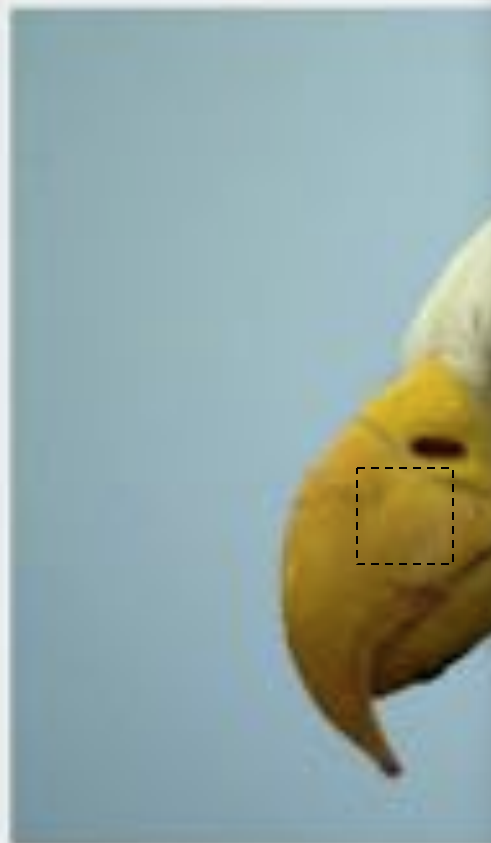
Monochromators measure the energy at different wavelengths



ISBTBIO: scene window

eagle - LCD-Apple

Name: eagle - LCD-Apple
Row, Col: 338 by 512
Hgt, Wdth (89.45, 138.30) mm
Sample: 266.21 μ m
Deg/samp: 0.03



1

Gamma

Standard RGB

Display

0.5 m

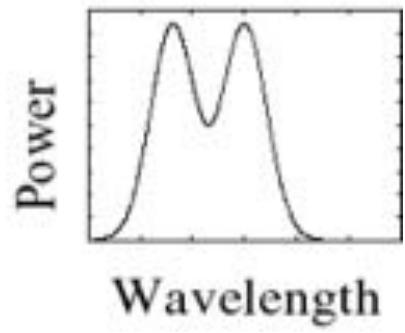
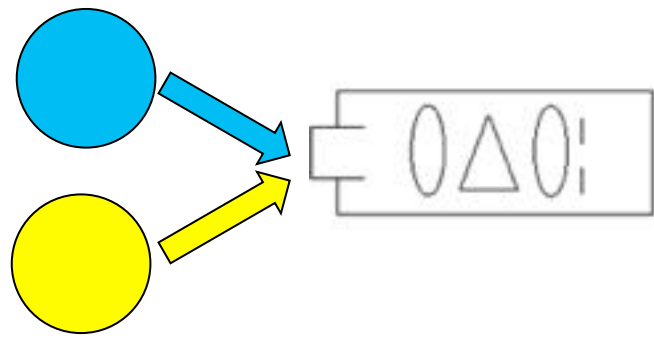
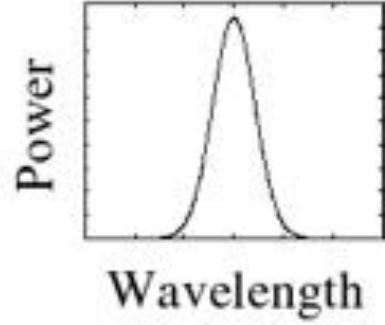
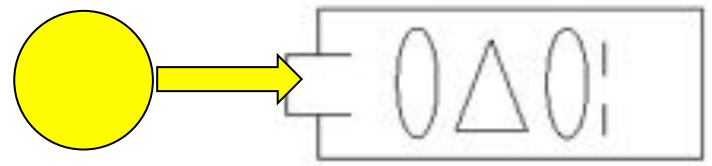
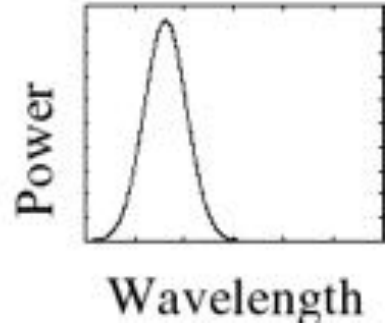
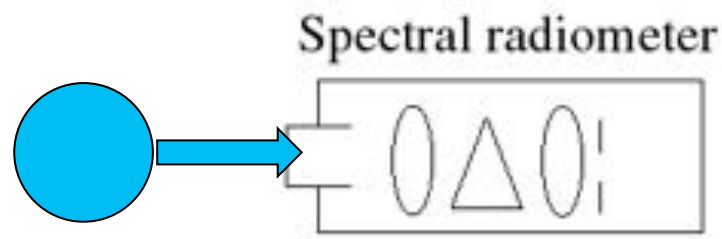
Color-matching



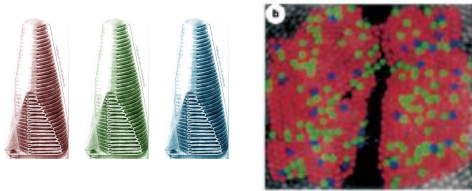
Superposition of light

- Mixture (summation) experiments are fundamental throughout science

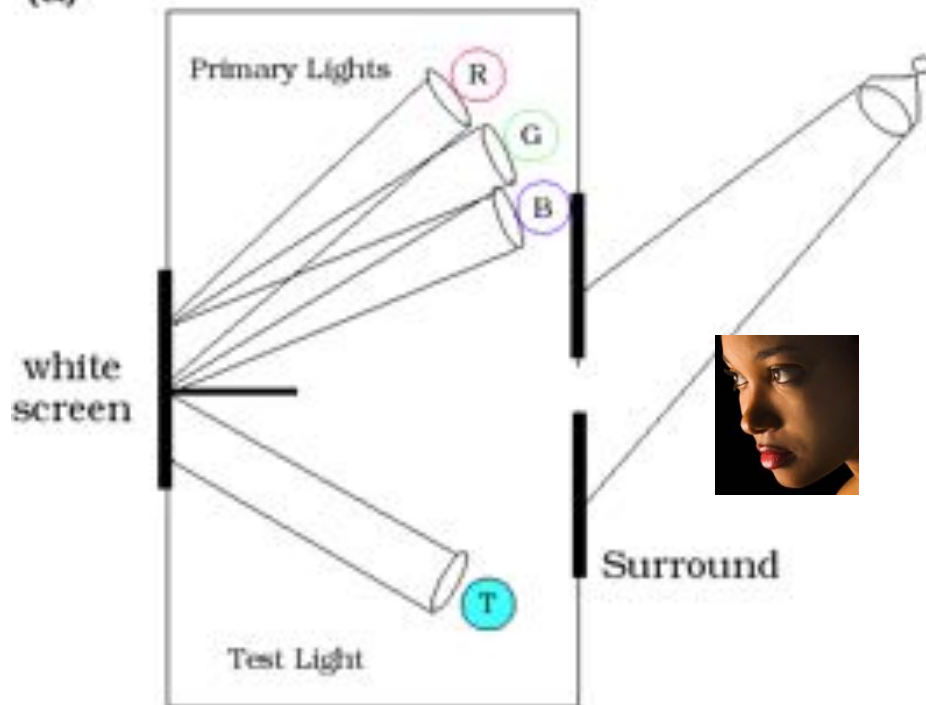
- Mixtures of incoherent lights sum



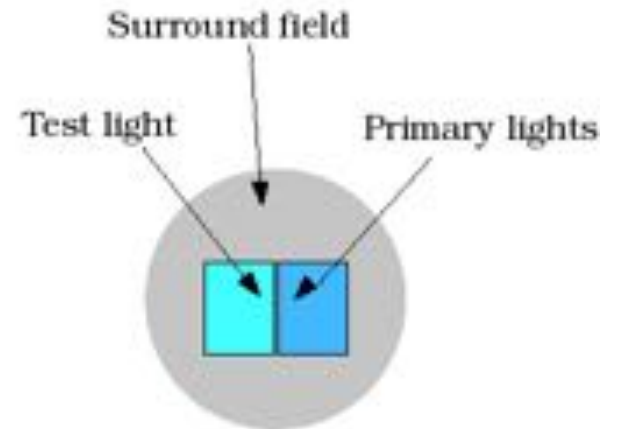
Cone color matching experiment



(a)

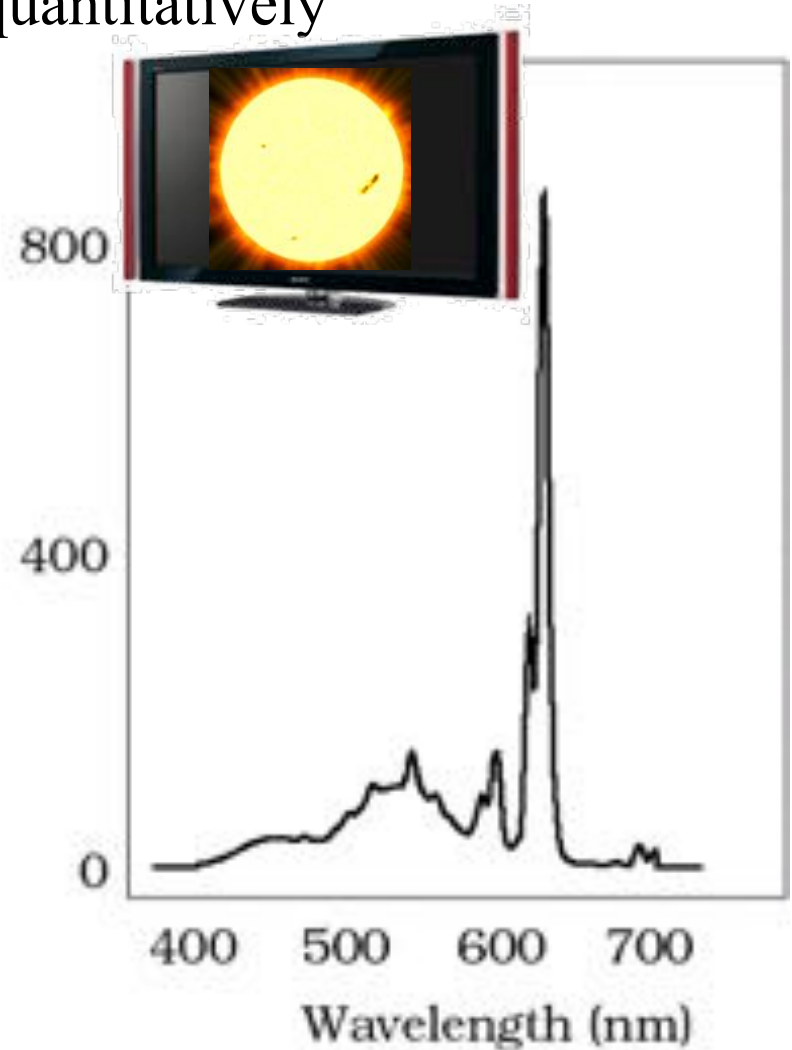
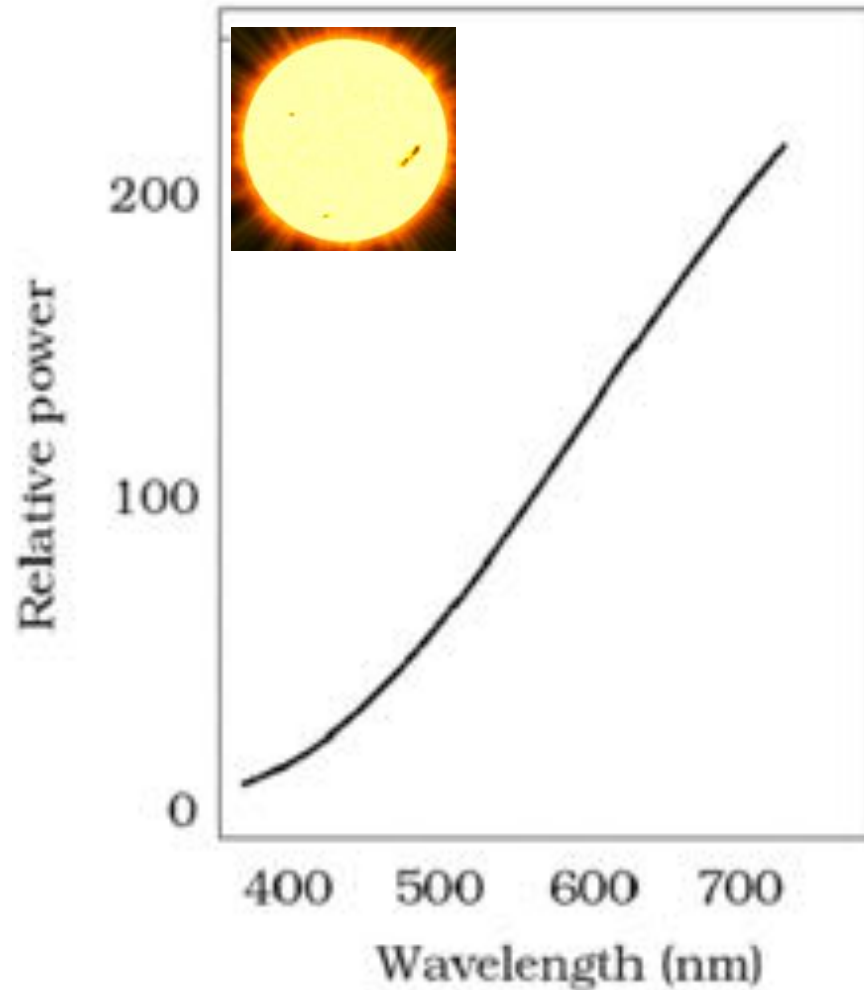


(b)

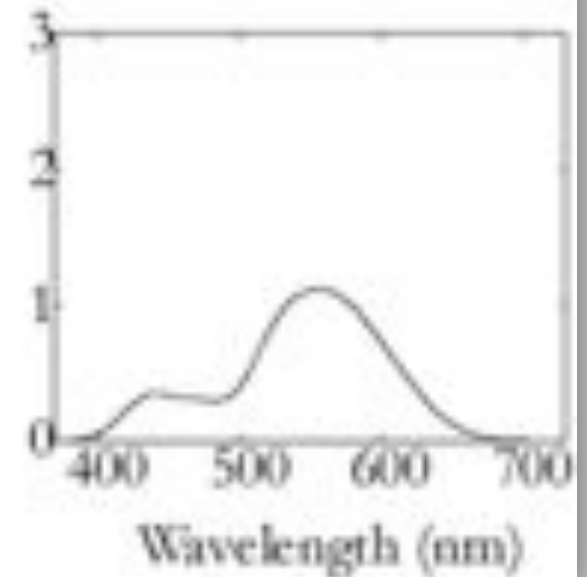
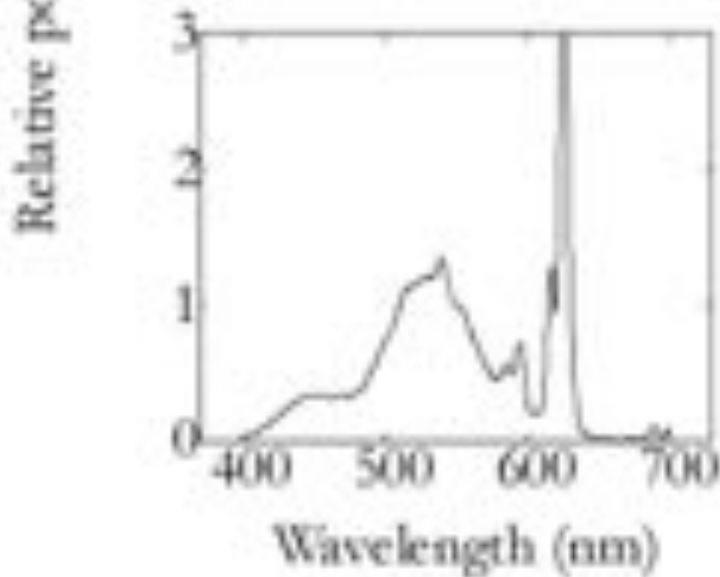
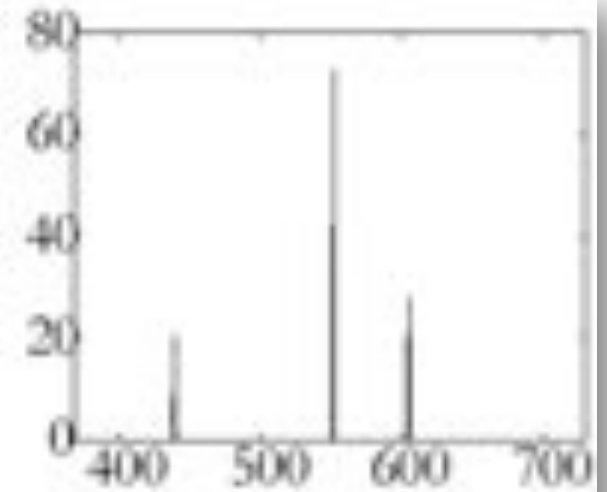
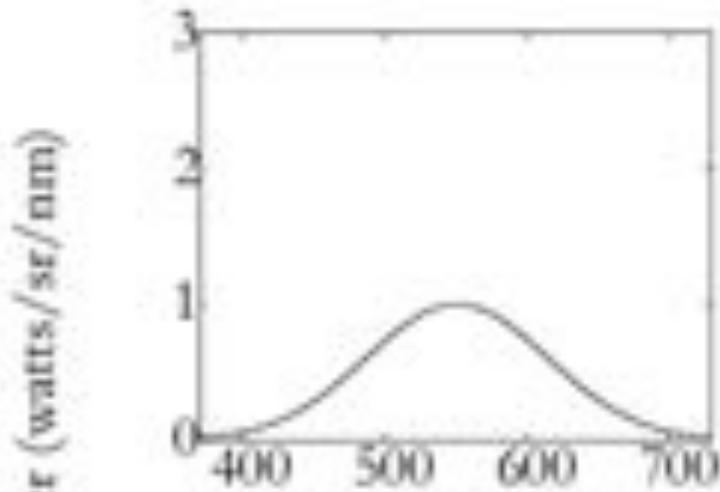


Metamerism

Color matching is an important illusion that is understood quantitatively

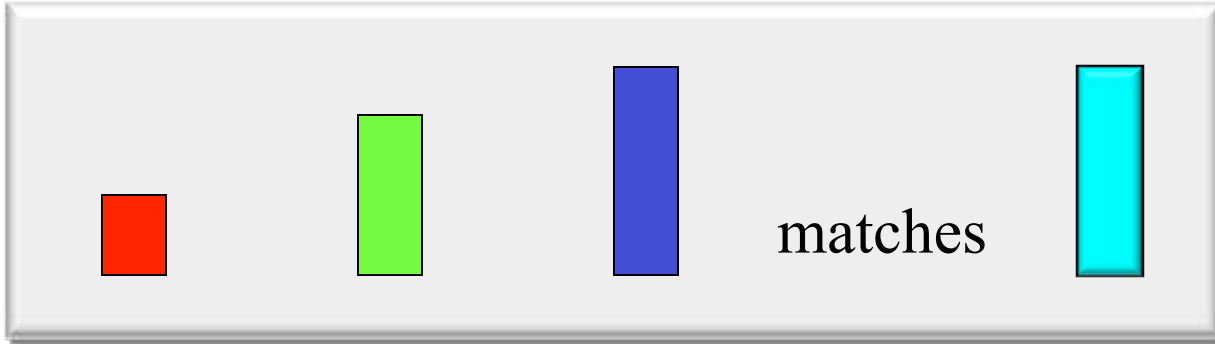


Metamerism is a big effect

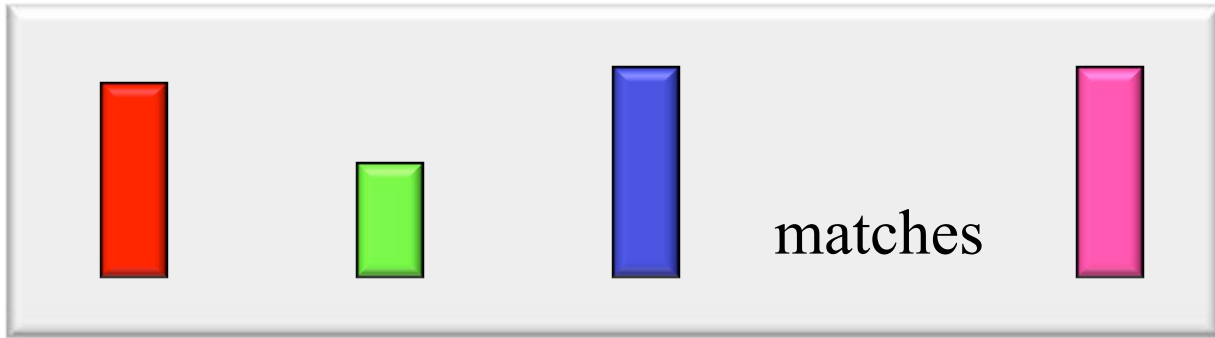


The color matching experiment is linear (Grassmann's Law)

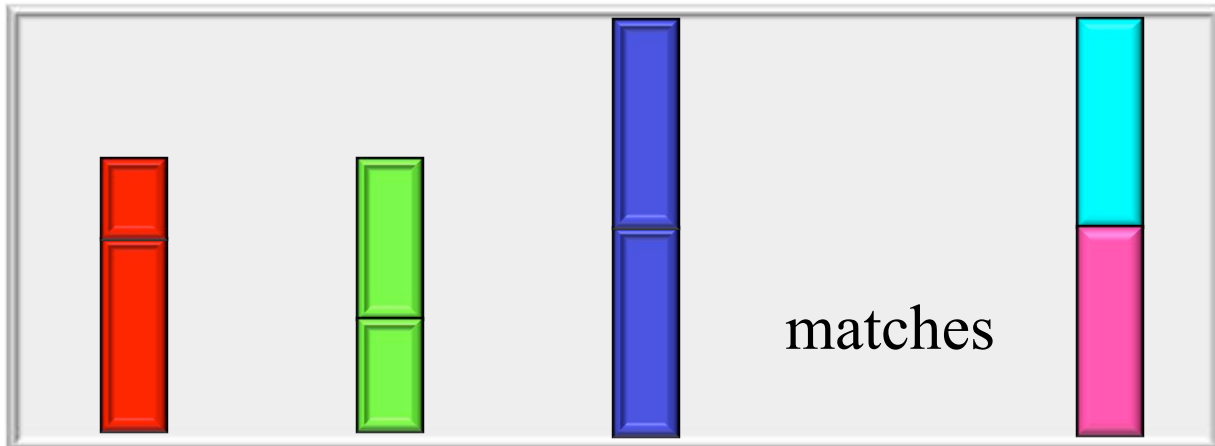
If



and



then



The invention of linear vector spaces



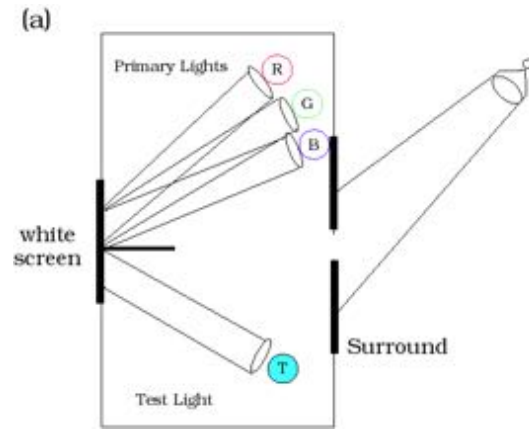
Color matching experiment equation

Response

CIE RGB functions

$$\begin{pmatrix} R \\ G \\ B \end{pmatrix} = \begin{pmatrix} \text{red line} \\ \text{black line} \\ \text{blue line} \end{pmatrix} \begin{pmatrix} \text{ } \\ \text{ } \\ \text{ } \end{pmatrix}$$

Test light
SPD



Color matching equations

Response

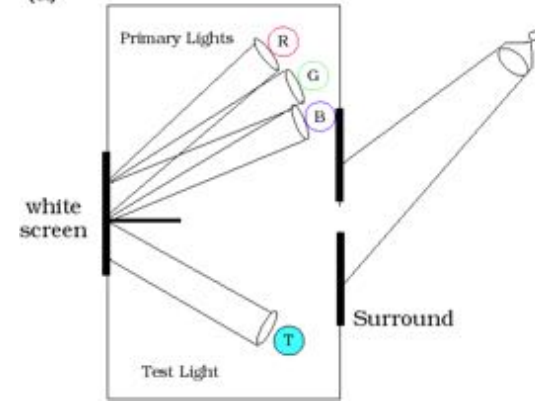
$$\begin{pmatrix} r \\ g \\ b \end{pmatrix} = \begin{pmatrix} 0 & 0 & 0 & 0 & 0 & 0 & 1 & 0 & 0 & 0 & 0 & 0 \\ \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} \\ \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} \\ \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} & \text{---} \end{pmatrix} \begin{pmatrix} 0 \\ 0 \\ 0 \\ \dots \\ 1 \\ \dots \\ 0 \\ 0 \\ 0 \end{pmatrix}$$

CIE RGB functions

0 0 0 0 0 0 1 0 0 0 0 0

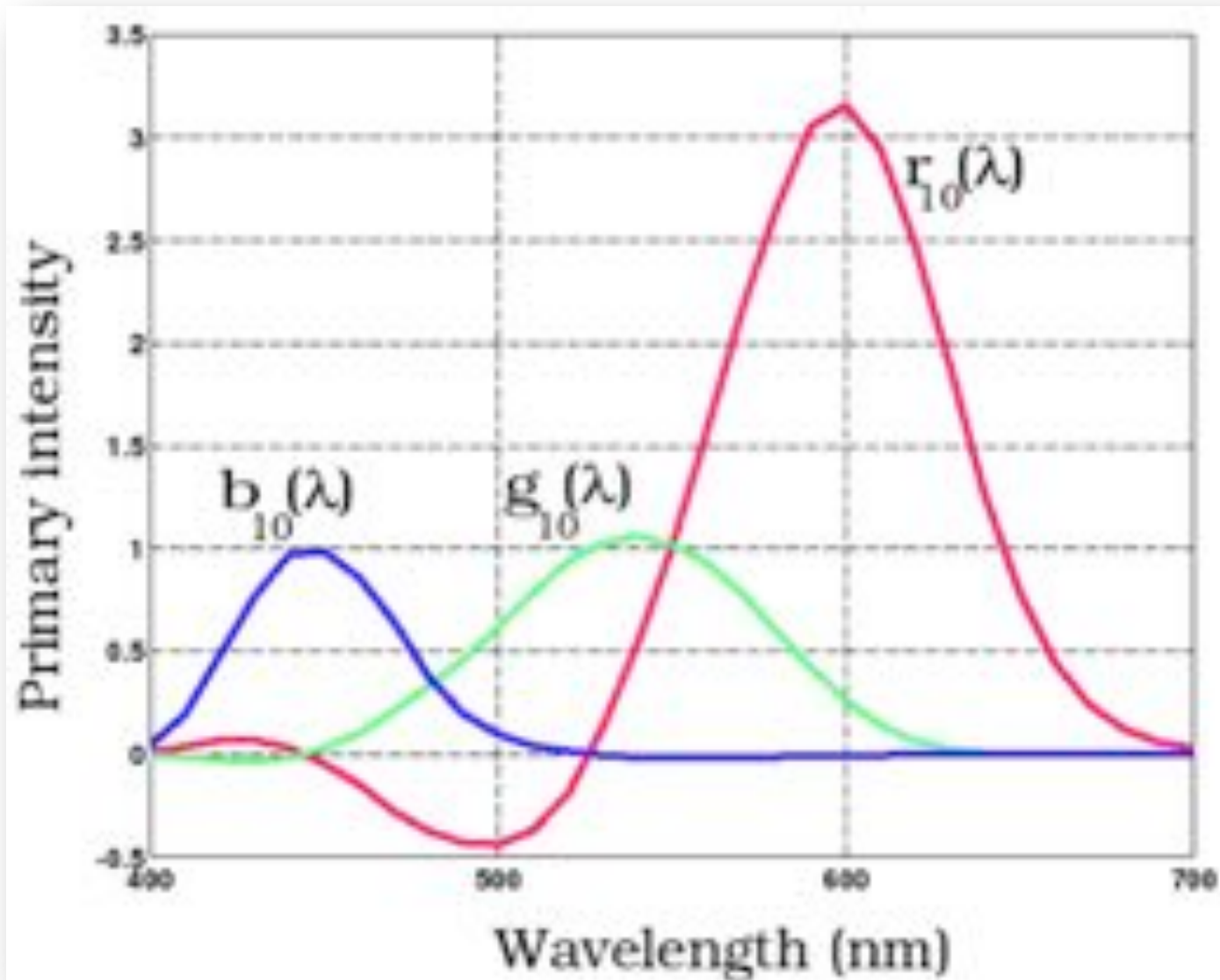
r g b

(a)

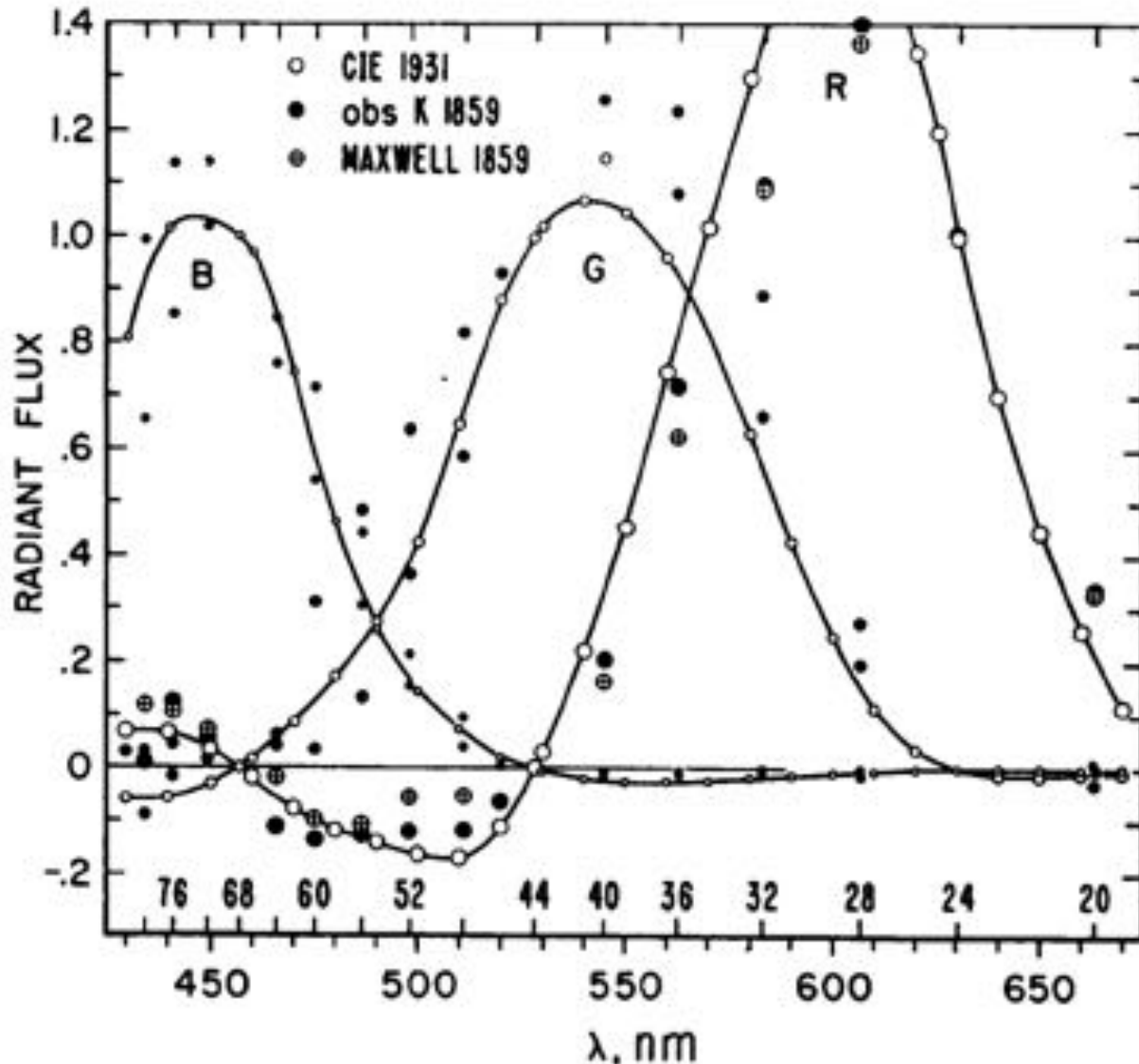


Test light
SPD

CIE color matching functions (CMFs; 10 deg, Wright and Guild)



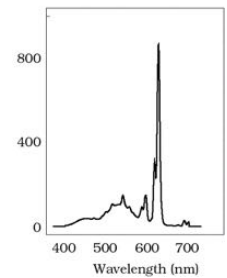
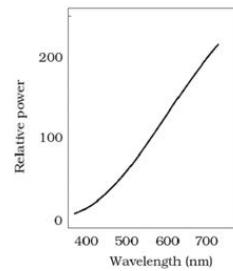
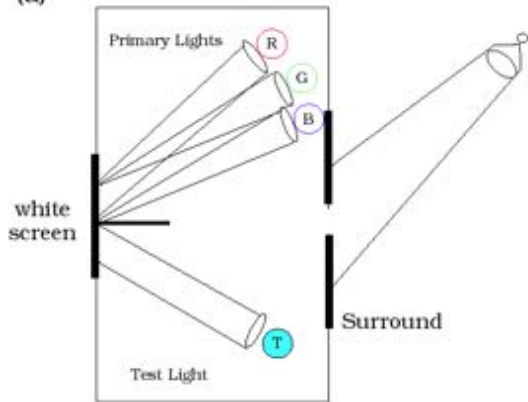
Maxwell measured the color-matching functions (From Judd, PNAS)



CMFs predict appearance matches

Two SPDs are metamers when they differ physically but are matched in the color-matching experiment

(a)

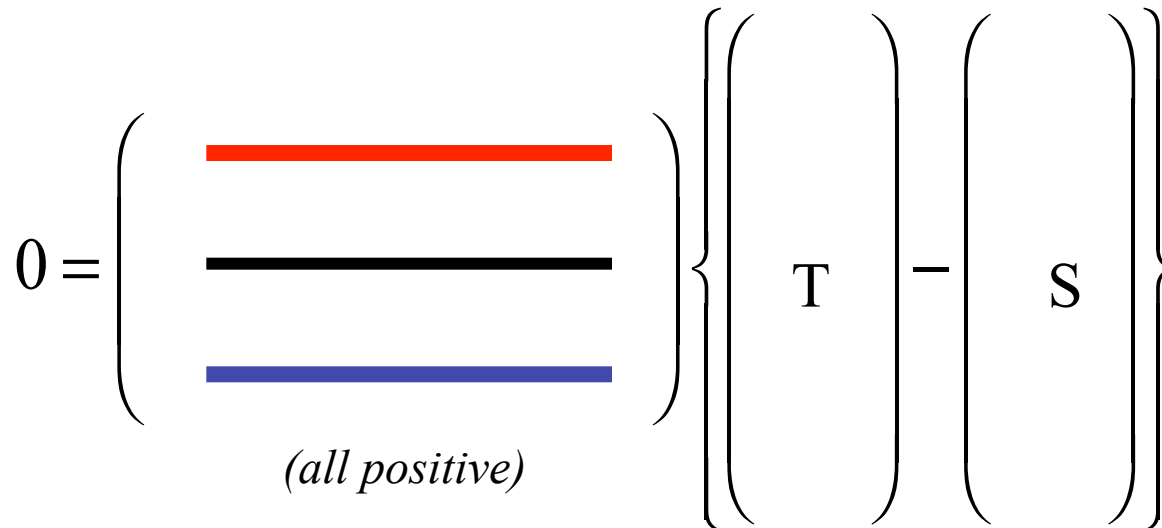
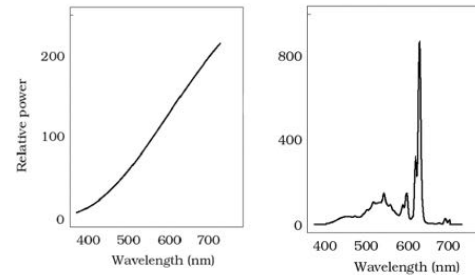


$$\begin{pmatrix} \\ \\ \end{pmatrix} = \begin{pmatrix} \text{red bar} \\ \text{black bar} \\ \text{blue bar} \end{pmatrix} \mathbf{T} = \begin{pmatrix} \text{red bar} \\ \text{black bar} \\ \text{blue bar} \end{pmatrix} \mathbf{S}$$

Metamer differences: CMF null space

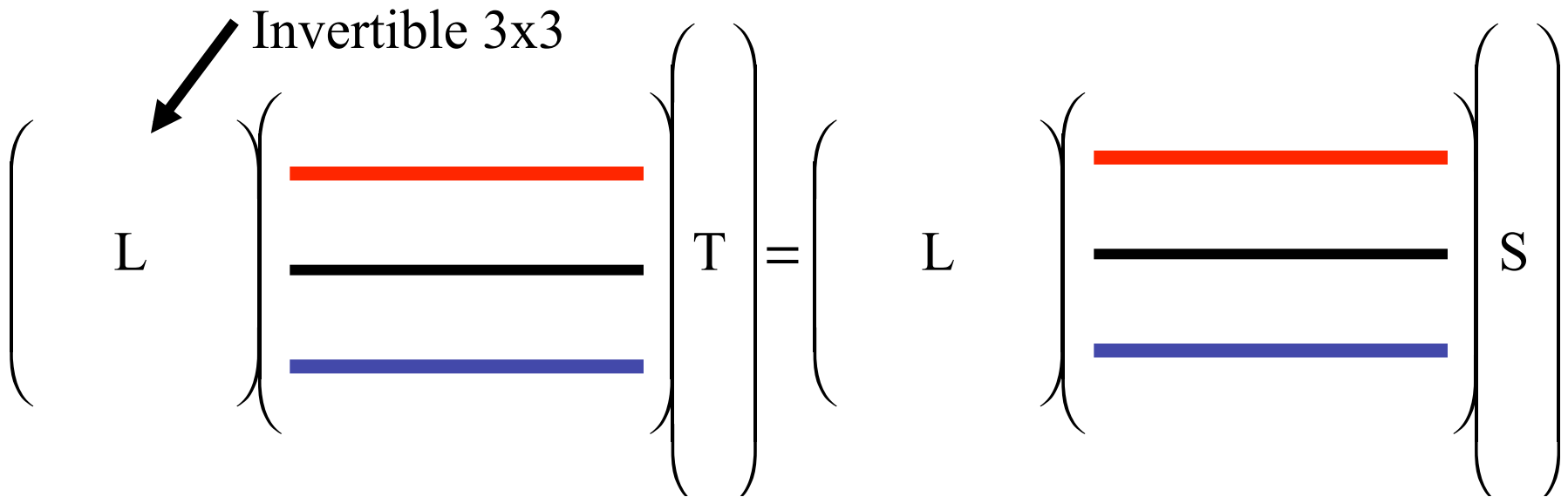
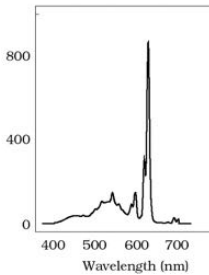
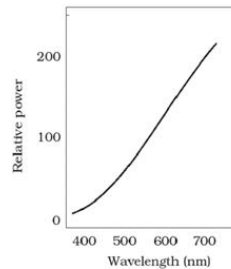
Two SPDs are metamers when they differ physically but are matched in the color-matching experiment

Metamer differences always have negative energy somewhere in the spectrum



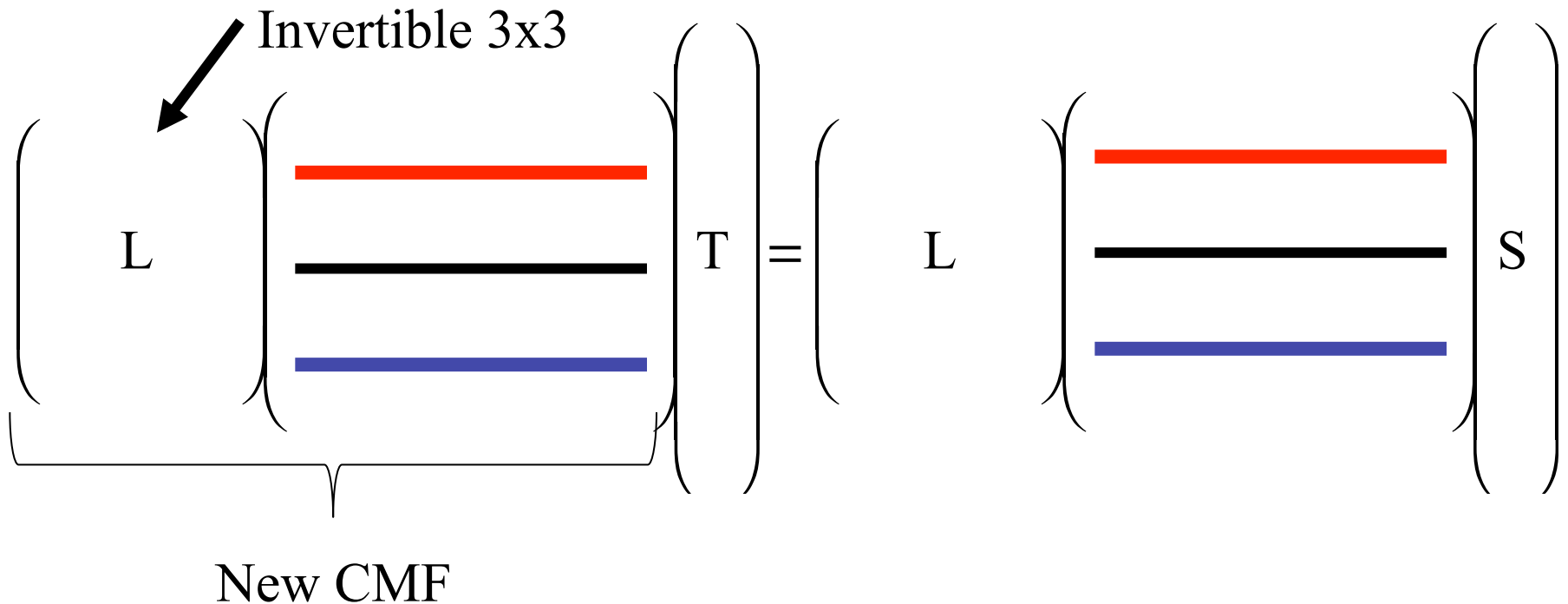
CMFs: A uniqueness theorem

Any invertible linear transformation, L , of the CMFs predicts the same metamers



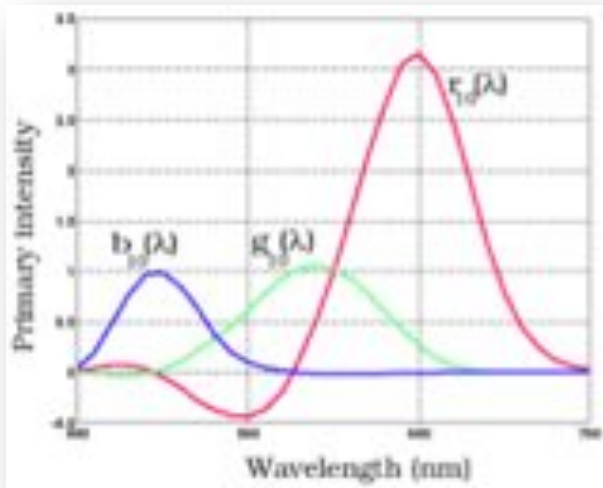
CMFs: A uniqueness theorem

Different choices of primaries produce different CMFs
Related by a linear transformation
(see *Foundations of Vision* for proof)

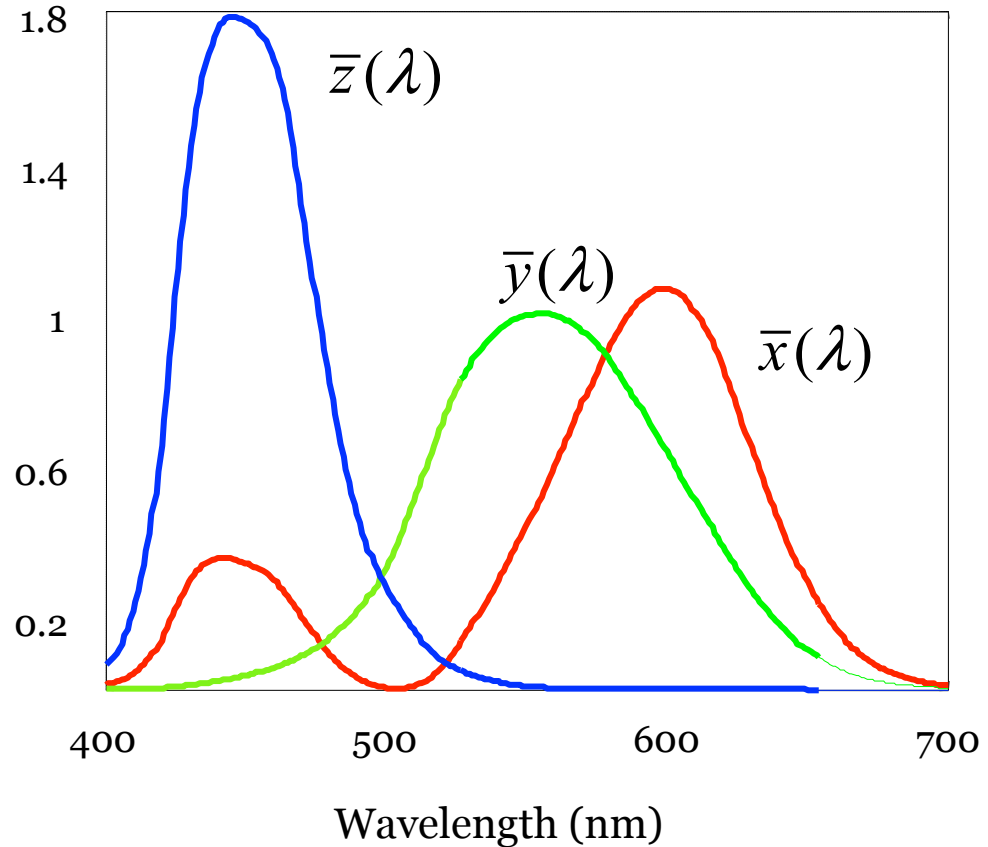


The CIE (1931) standard CMFs used today

Color-matching functions
(empirical)



CIE (1931) 10 deg XYZ functions



The CIE (1931) XYZ standard CMFs

Standards are specified with radiance in **energy**, not photons

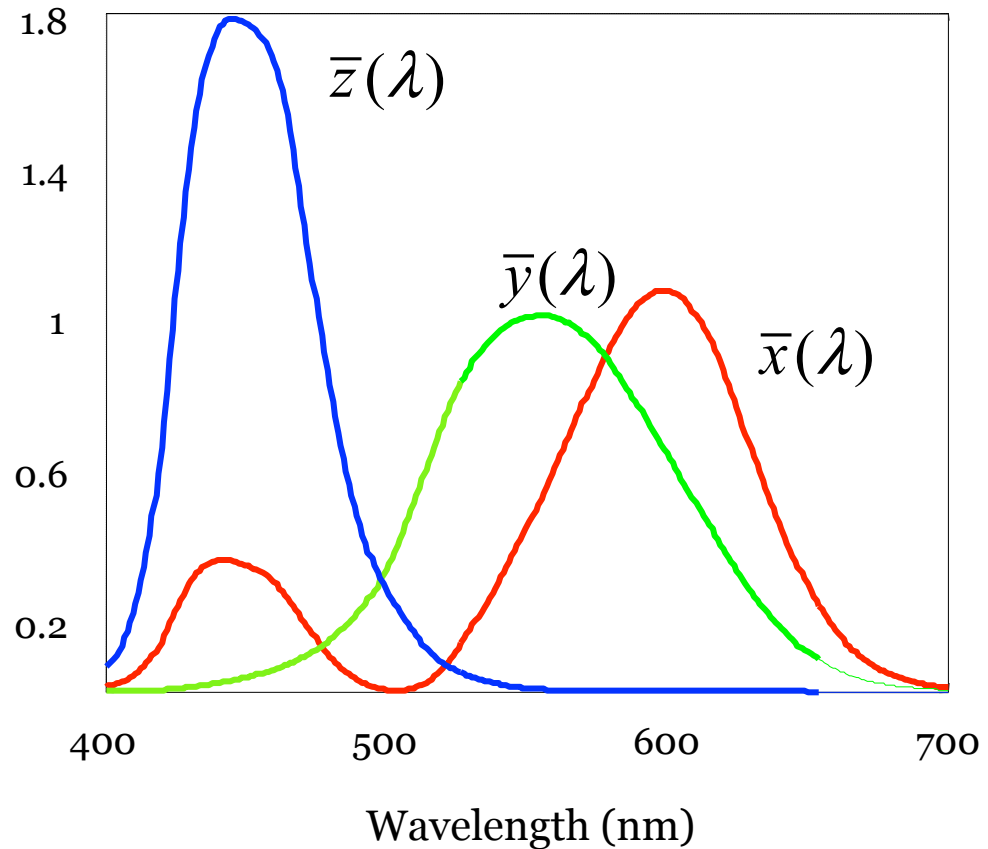
Radiance

$$X = \sum_{\lambda} \bar{x}(\lambda) t(\lambda) d\lambda$$

$$Y = \sum_{\lambda} \bar{y}(\lambda) t(\lambda) d\lambda$$

$$Z = \sum_{\lambda} \bar{z}(\lambda) t(\lambda) d\lambda$$

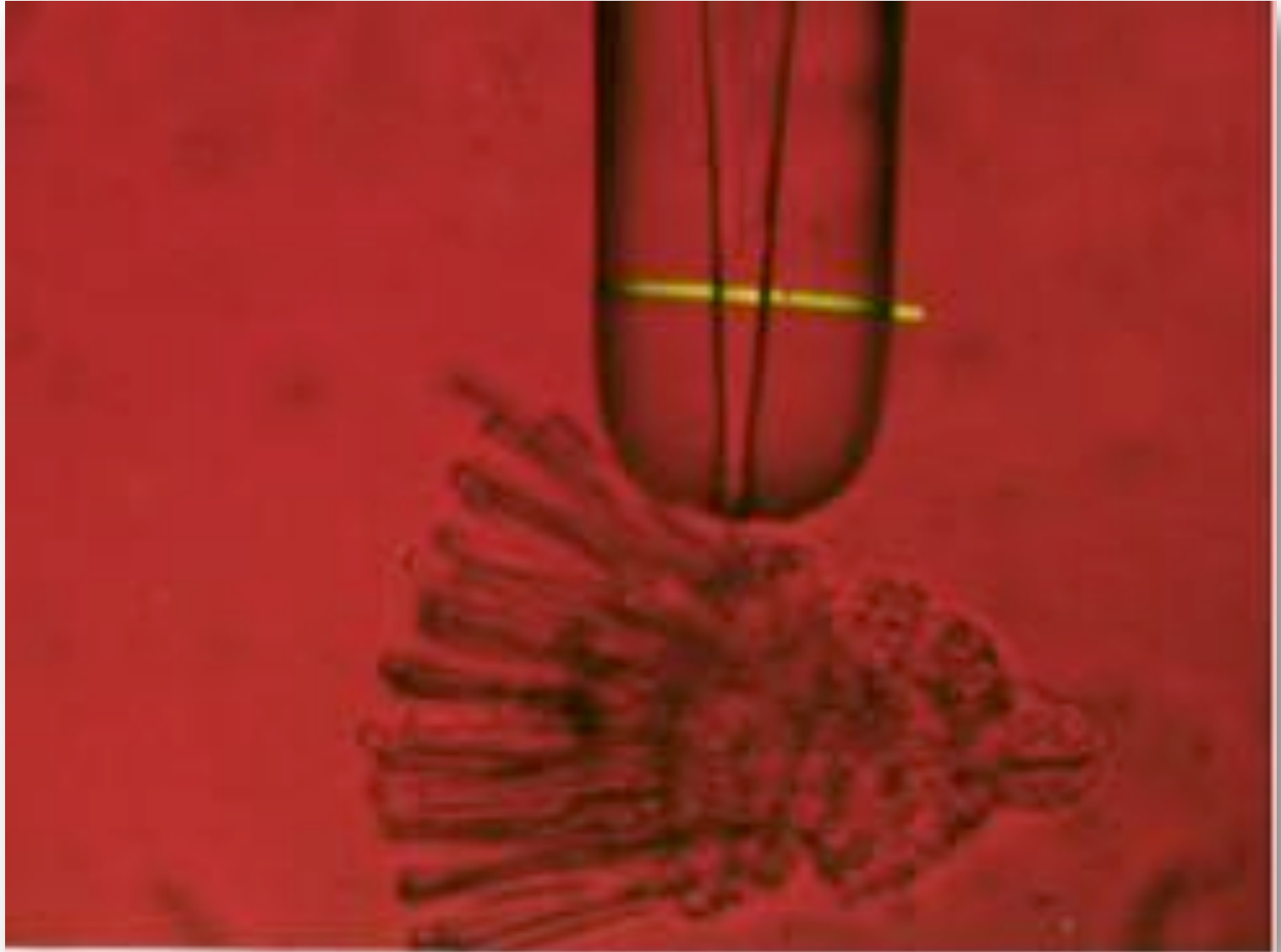
CIE (1931) 10 deg XYZ functions



Photoreceptor physiology catches up (Baylor and Schnapf)

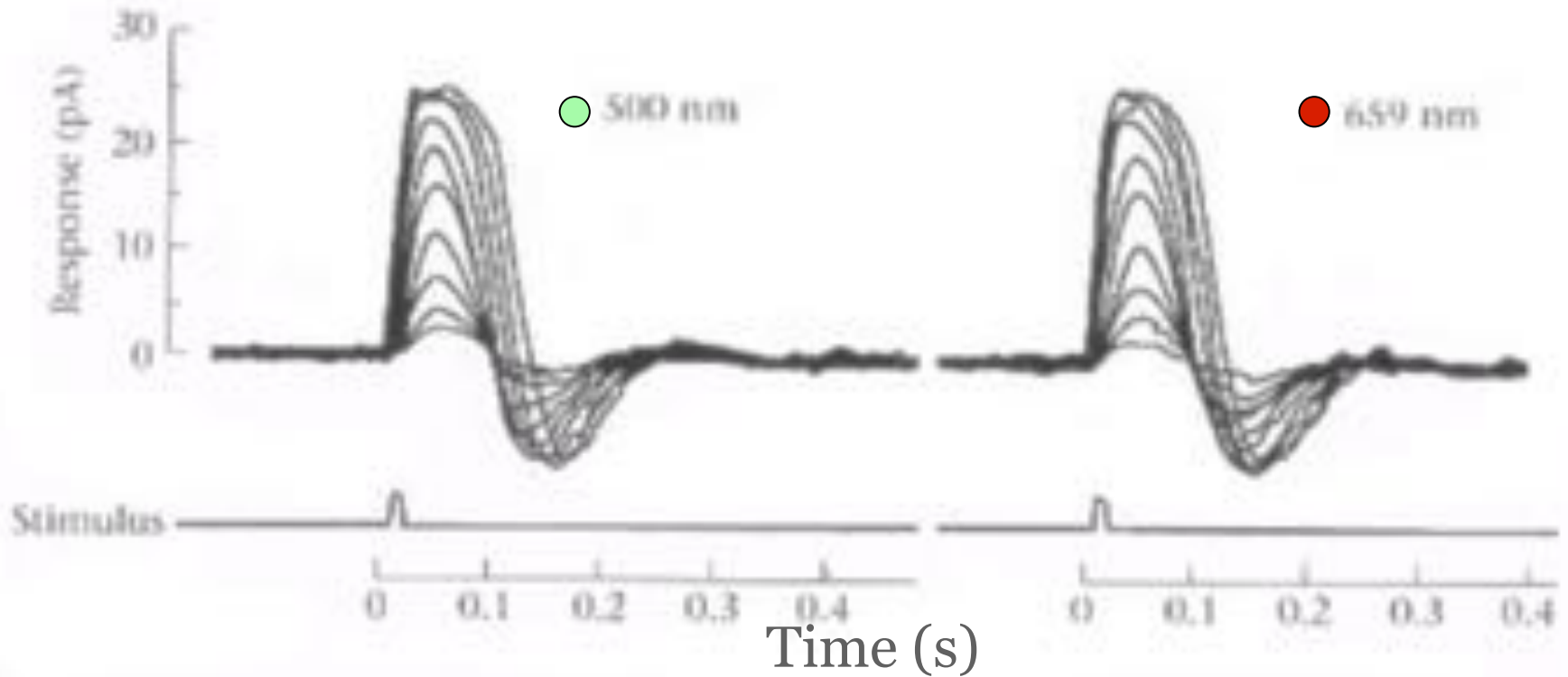


Single cone photocurrent measurements

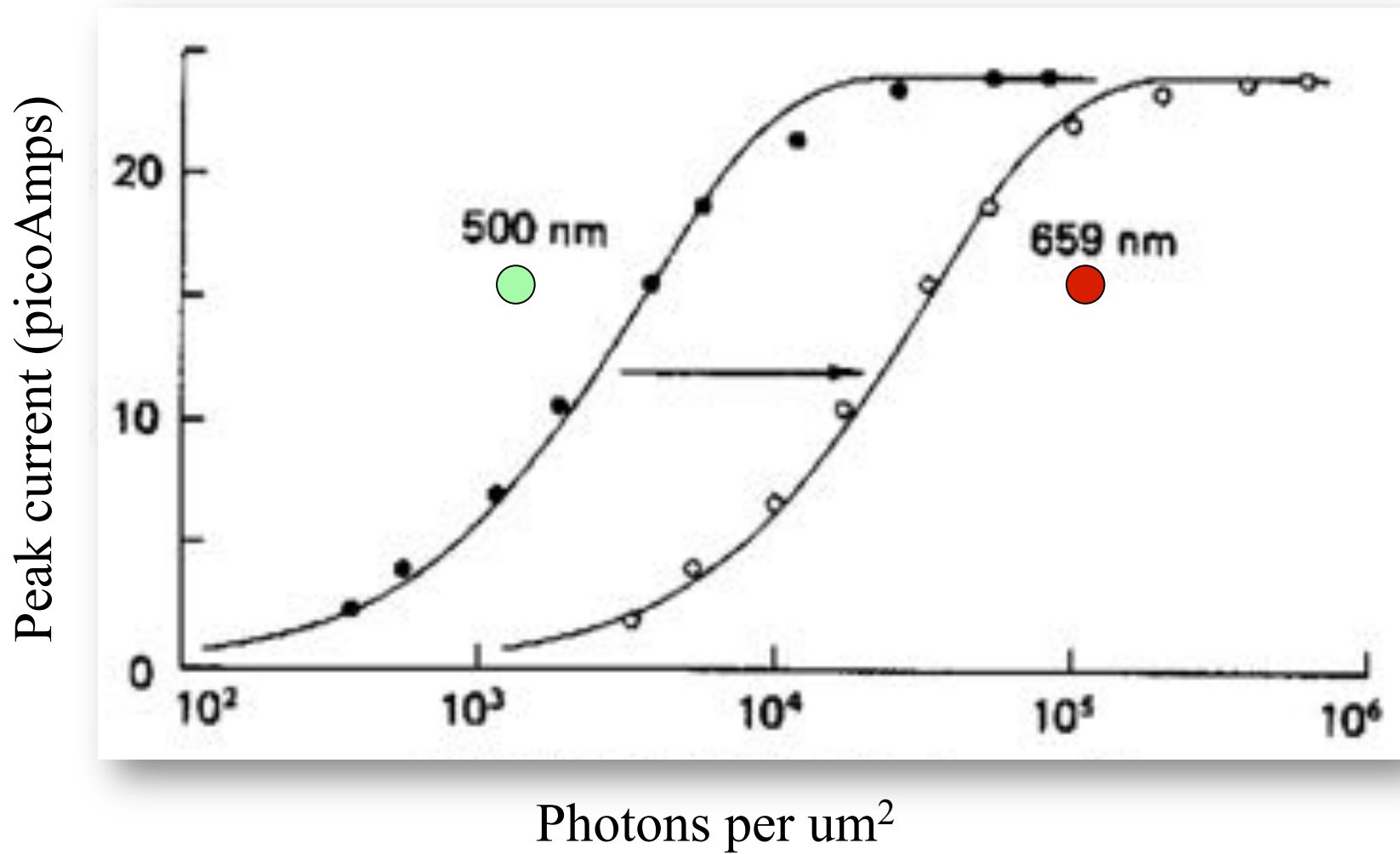


Principle of univariance (Rushton)

Cone photocurrent using stimuli with different wavelengths

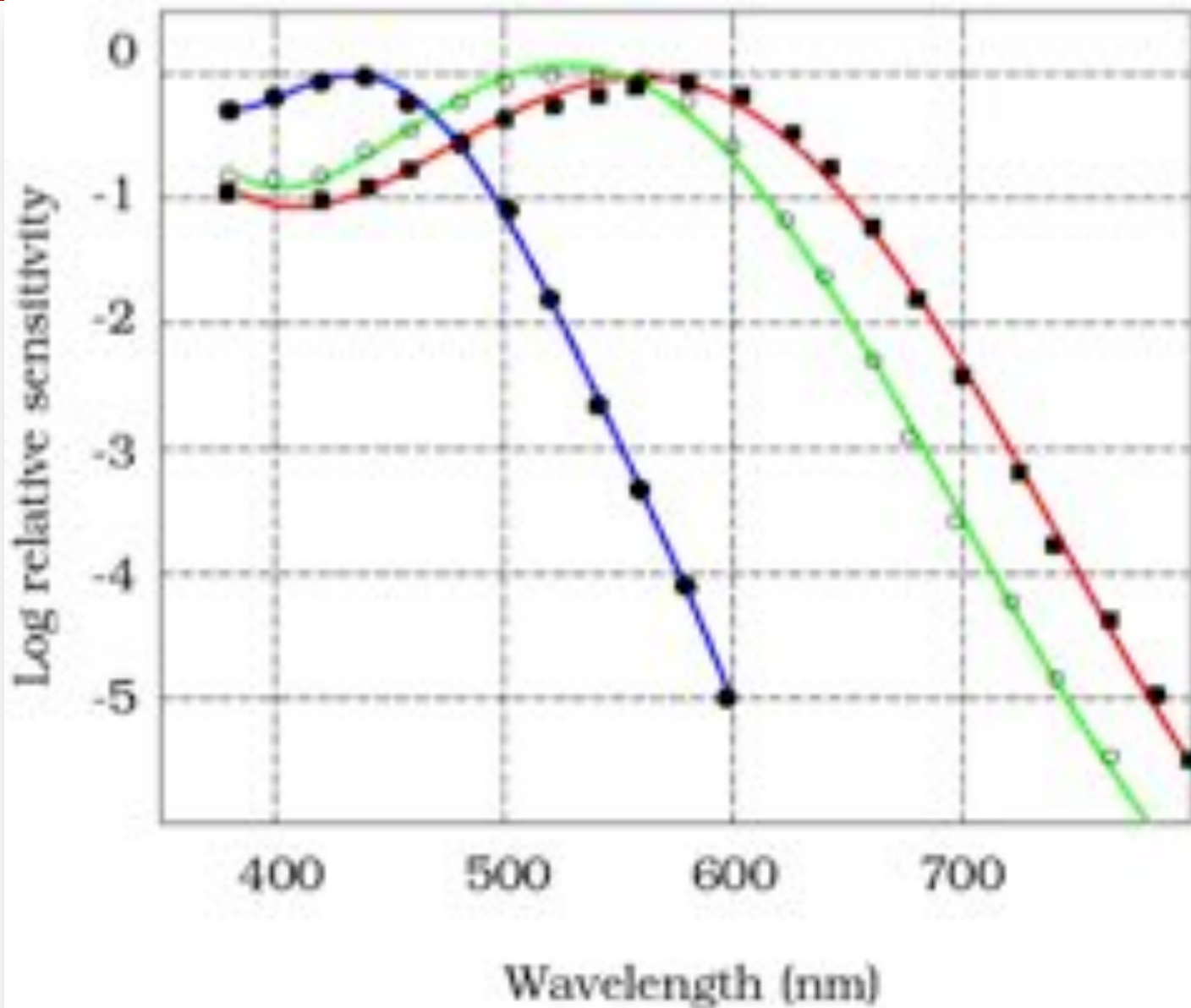


Spectral response of nonlinear systems

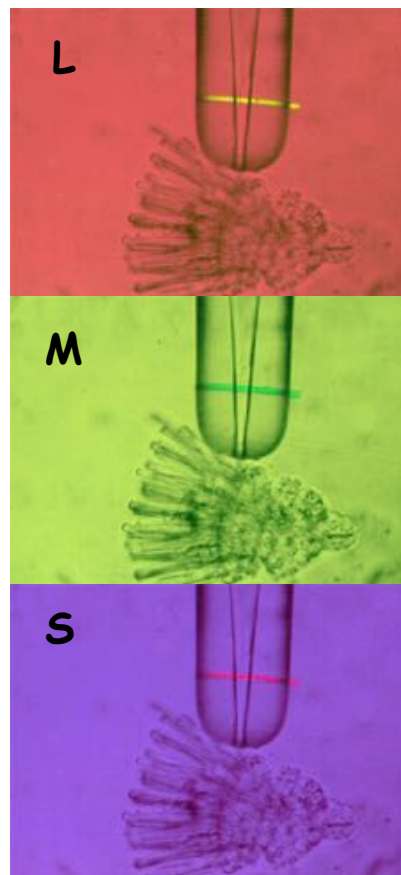
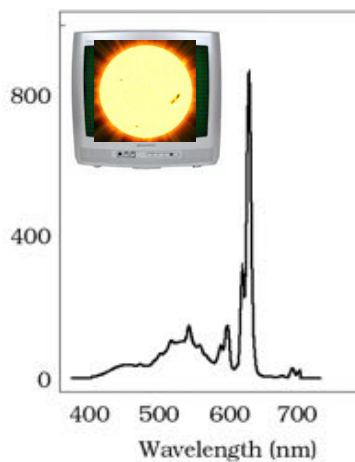
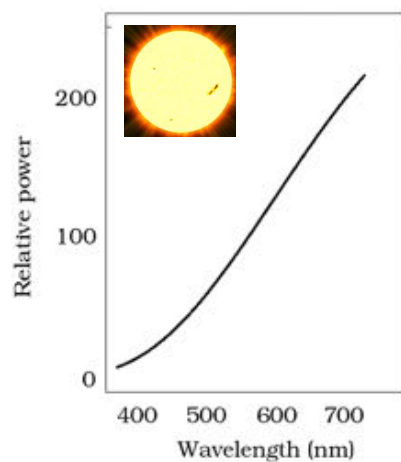


Three types of cones

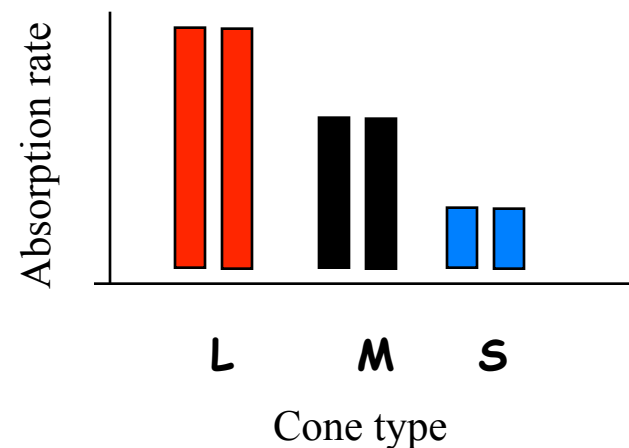
(Baylor, Schnapf, Nunn)



Stimuli causing equal cone absorptions and seen in the same context look the same

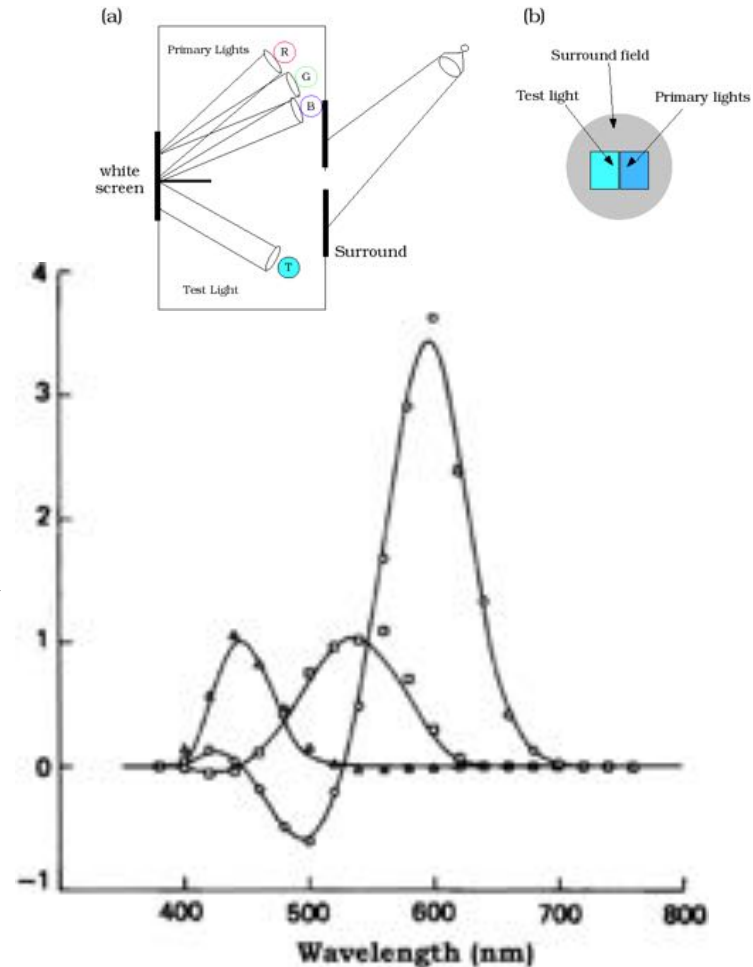
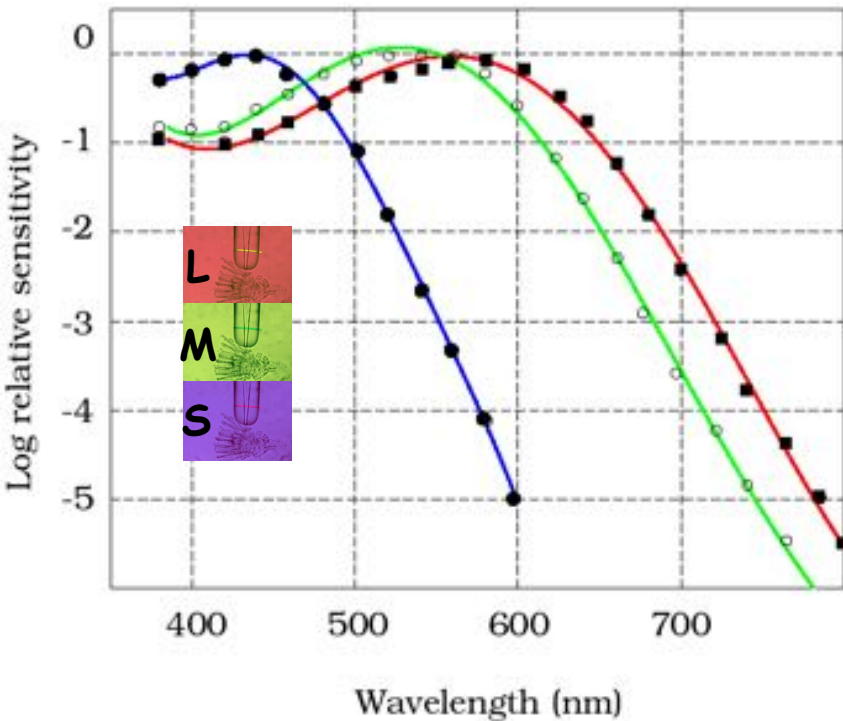


The cones spectral sensitivities predict color matches.



The measured cone responses predict the color-matching experiment quantitatively

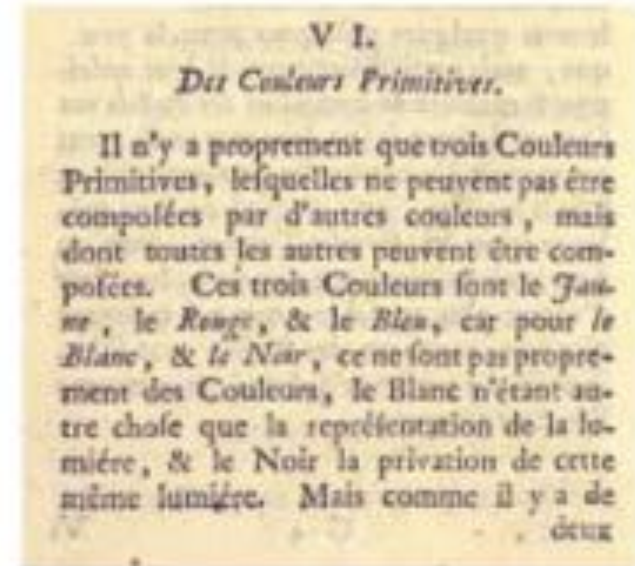
The cone spectral sensitivities must be within a linear transformation of the CMFs



Selective comments on the history of color science

Trichromacy put into practice

The Hague, 1708,
Anonymous



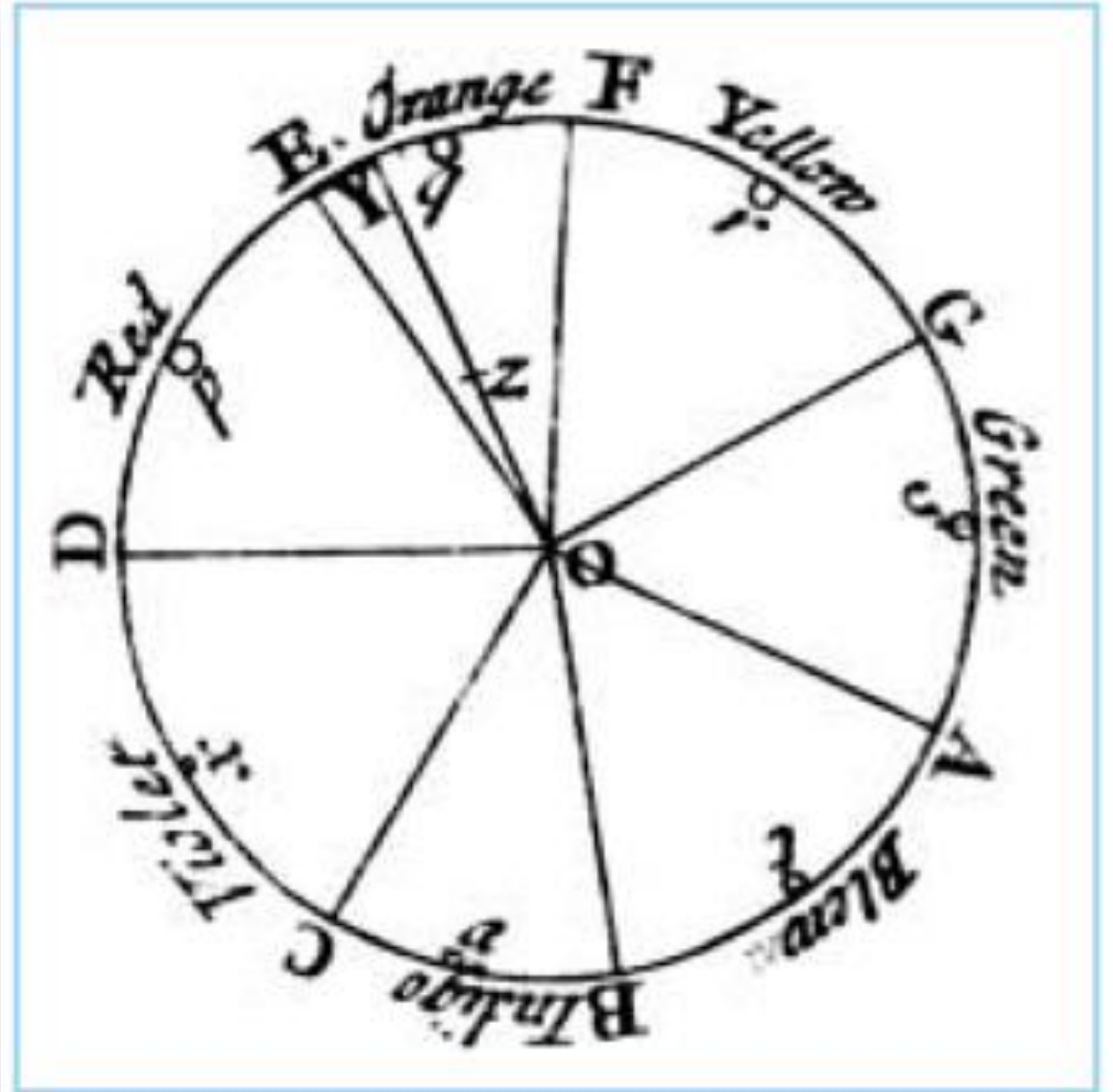
Newton's color circle from Opticks (1704)

(Image from John Mollon's chapter)

Newton combined psychology and physics, showing which colors are complementary by placing them on a circle

Placing the colors on a circle was an error, subsequently fixed by Helmholtz

He is still Isaac Newton



Thomas Young explains trichromacy as biology

“Now, as it is almost impossible to conceive each sensitive point of the retina to contain an infinite number of particles, each capable of vibrating in perfect unison with every possible undulation, it becomes necessary to suppose the number limited, for instance to the three principal colours, red, yellow and blue, of which the undulations are related in magnitude nearly as the numbers 8, 7, and 6; and that each of the particles is capable of being put in motion less or more forcibly, by undulations differing less or more from perfect unison; for instance, the undulations of green light being nearly in the ratio of $6 \frac{1}{2}$, will affect equally the particles in unison with yellow and blue, and produce the same effect as a light composed of those two species”

**On the theory of lights and colours.
Philosophical Transactions of the
Royal Society 92, 12-48.**





Thomas Young (1802)
On the theory of lights
and colours.
Philosophical
Transactions of the
Royal Society 92,
12-48.

“....this paper contains nothing which deserves the name, either of experiment or of discovery, and as it is, in fact, destitute of every species of merit....”

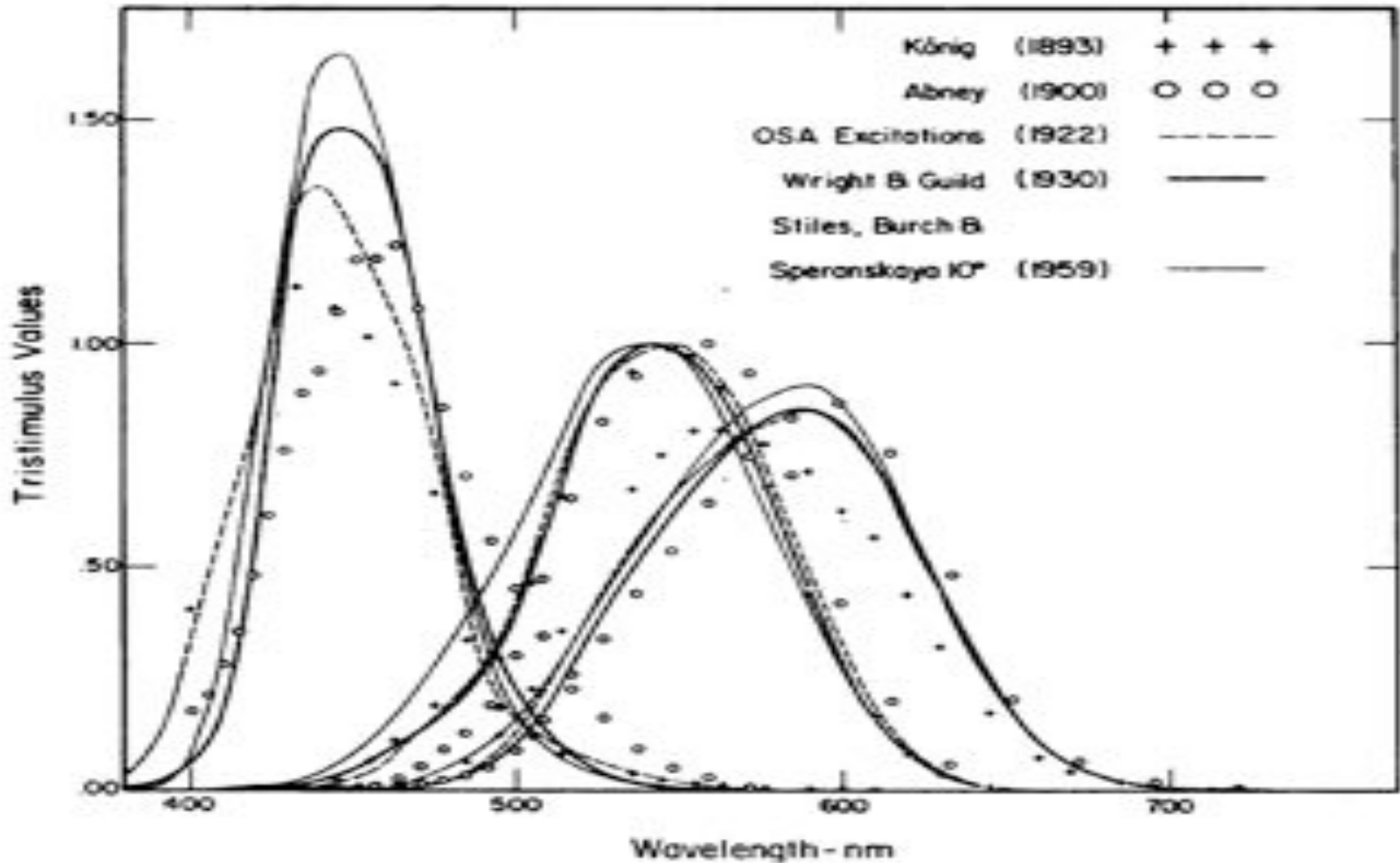
“We now dismiss, for the present, the feeble lucubrations of this author, in which we have searched without success for some traces of learning, acuteness, and ingenuity, that might compensate his evident deficiency in the powers of solid thinking, calm and patient investigation....”

Henry Brougham in Edinburgh Review, an ardent admirer of Newton, criticizing Thomas Young’s Bakerian Lectures.

Early estimates of the cone curves

- After Maxwell, Young, Helmholtz and Grassmann scientists wondered what might be the spectral sensitivity of the biological sensors that encode the light.
- They knew of the free linear transform. They made some guesses by finding a transform that produced all positive (photochemical) sensors.

Early estimates of the cone curves



Early estimates of the cone curves

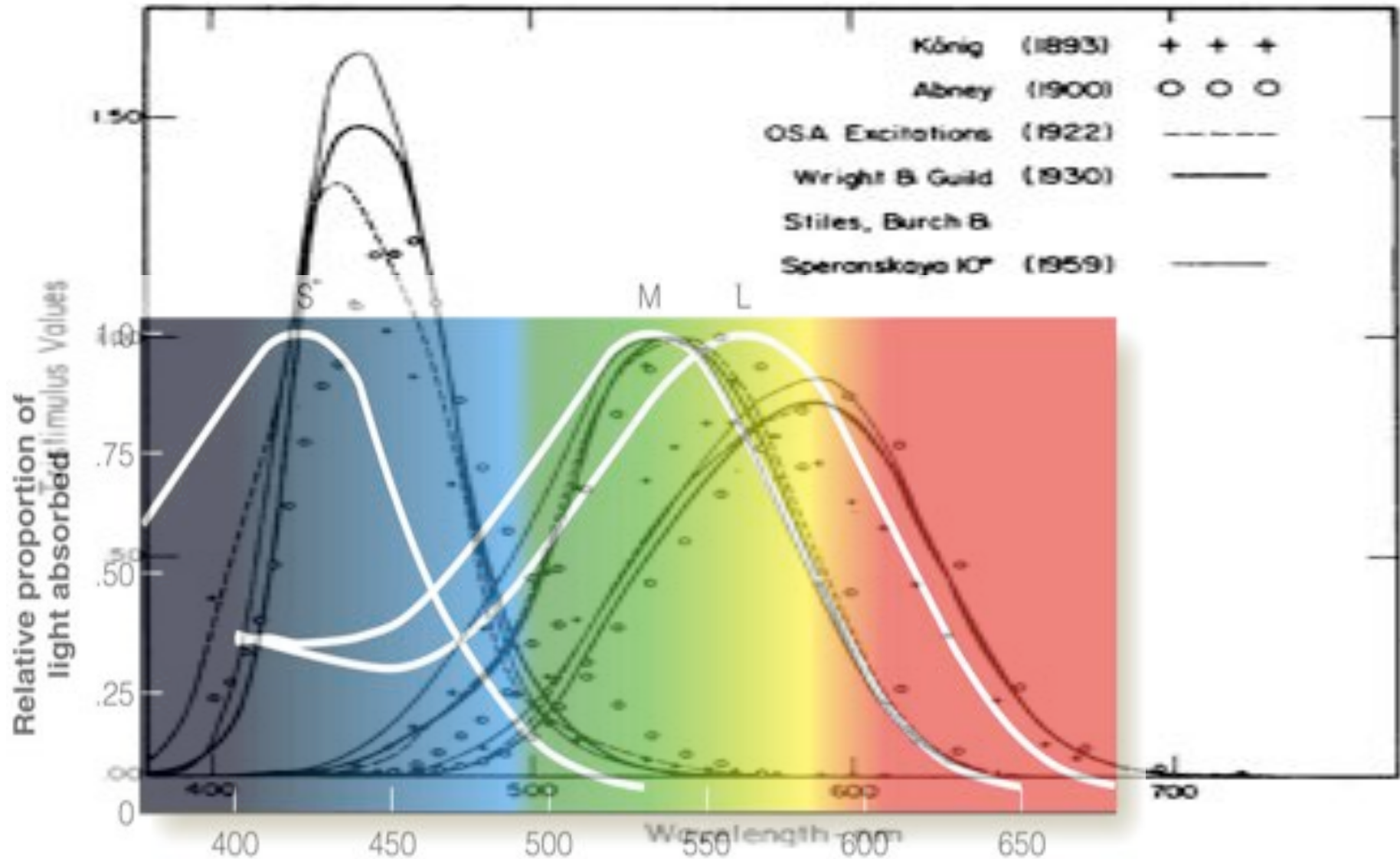


Image Systems Engineering Toolbox for Biology (ISETBIO)



t_humanLineSpread

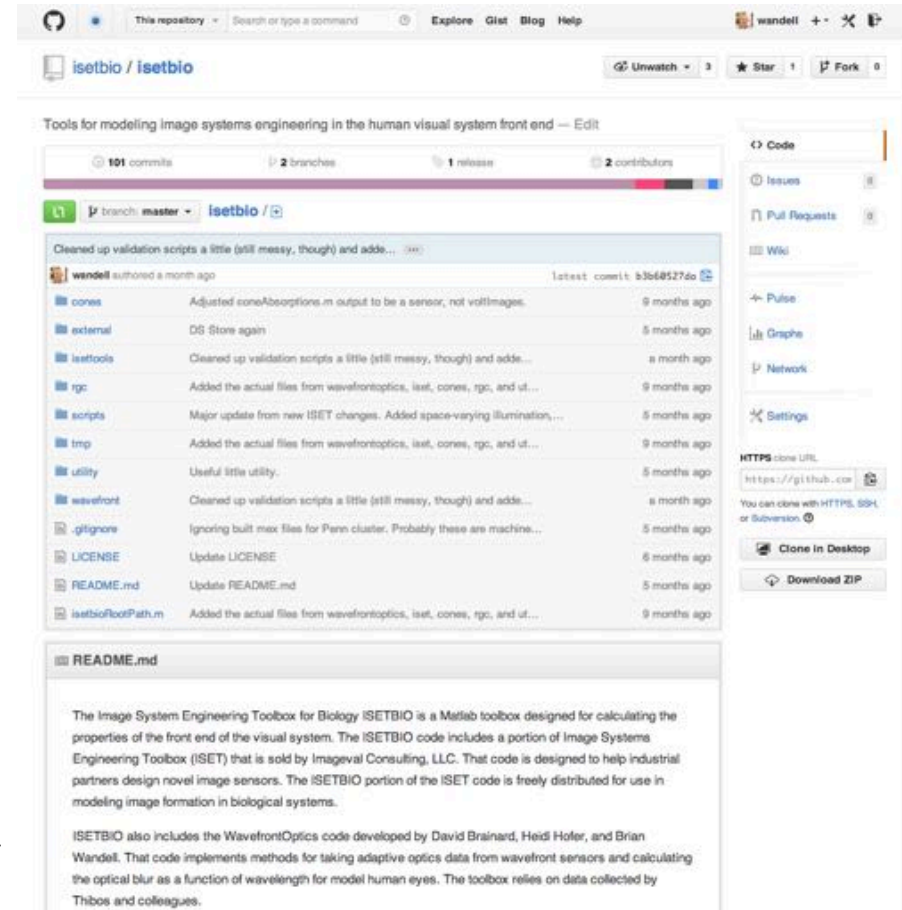
Image Systems Engineering Toolbox for Biology (ISETBIO)

<https://github.com/isetbio/isetbio>

Goal: Develop an open-source computational model that calculates the upper bounds of human visibility for realistic targets

Why now: Important advances in modeling and understanding of human image formation (optics) and retinal encoding; enormous advances in computational power

Methodology: Combine quantification of scene radiance, retinal irradiance, and cone absorbance with high quality machine learning computational algorithms for classification



The screenshot shows the GitHub repository page for 'isetbio / isetbio'. The repository is in the 'master' branch and has 101 commits, 2 branches, 1 release, and 2 contributors. The commit history is visible, with the most recent commit by 'wandell' a month ago, titled 'Cleaned up validation scripts a little (still messy, though) and add...'. The commit message for this commit is 'Cleaned up validation scripts a little (still messy, though) and add...'. The commit history table lists several files and their commit dates:

File	Commit Message	Commit Date
cones	Adjusted coneAbsorptions.m output to be a sensor, not voltImages.	9 months ago
external	DG Store again	5 months ago
isettools	Cleaned up validation scripts a little (still messy, though) and add...	1 month ago
rgc	Added the actual files from wavefrontoptics, iset, cones, rgc, and ut...	9 months ago
scripts	Major update from new ISET changes. Added space-varying illumination, ...	5 months ago
tmp	Added the actual files from wavefrontoptics, iset, cones, rgc, and ut...	9 months ago
utility	Useful little utility.	5 months ago
wavefront	Cleaned up validation scripts a little (still messy, though) and add...	1 month ago
.gitignore	Ignoring built max files for Penn cluster. Probably these are machine...	5 months ago
LICENSE	Update LICENSE	6 months ago
README.md	Update README.md	5 months ago
isetbioFootPath.m	Added the actual files from wavefrontoptics, iset, cones, rgc, and ut...	9 months ago

The README.md file is also visible, containing the following text:

The Image System Engineering Toolbox for Biology ISETBIO is a Matlab toolbox designed for calculating the properties of the front end of the visual system. The ISETBIO code includes a portion of Image Systems Engineering Toolbox (ISET) that is sold by Imageval Consulting, LLC. That code is designed to help industrial partners design novel image sensors. The ISETBIO portion of the ISET code is freely distributed for use in modeling image formation in biological systems.

ISETBIO also includes the WavefrontOptics code developed by David Brainard, Heidi Hofer, and Brian Wandell. That code implements methods for taking adaptive optics data from wavefront sensors and calculating the optical blur as a function of wavelength for model human eyes. The toolbox relies on data collected by Thibos and colleagues.

Where we stand

Scene radiance modeling –

Quantified multispectral representations of the scene radiance, 2D screens, 3D light fields, high dynamic range

Image formation modeling –

Image formation from different optics models, chromatic aberration, shift-invariant, AO-derived wavefronts, wavelength-dependent and space-varying

Light transduction –

Inert pigments and cone absorption modeling. Includes Poisson characteristics, cone array properties, noise, dynamics

Light adaptation models –

Static and dynamic models

Eye movements –

First implementation

Computational observer theory –

Uses principles from biology, computing power and quantification of the front end encoding to understand and predict the limits of human performance in complex conditions (uncertainty, eye movements)

MUCH TODO

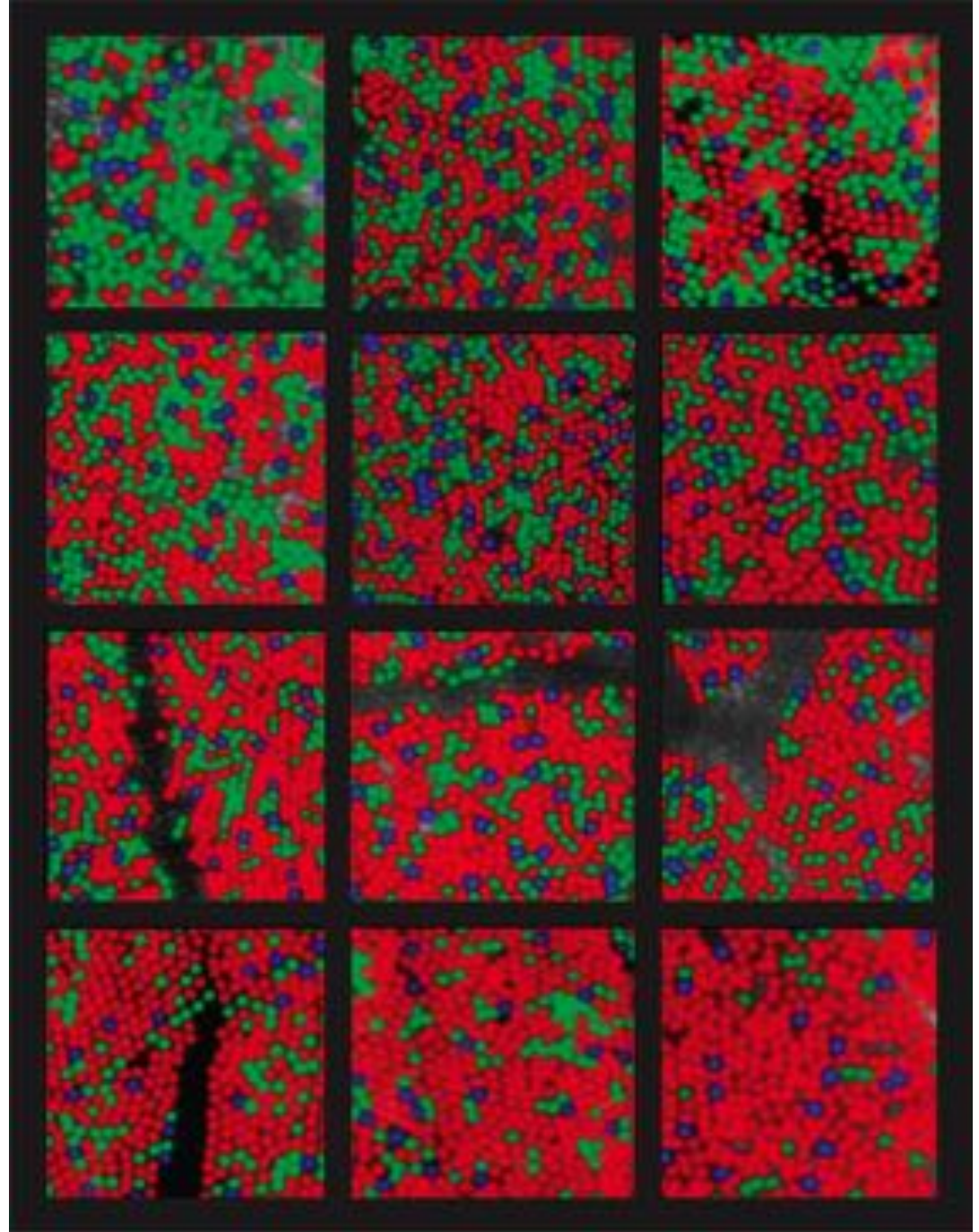
- Further into the nervous system (Retina, LGN, V1 ...)
- Different measurement methods (action potentials, LFPs, fMRI, ECoG, and EEG)
- Psychophysics (Detection, discrimination, acuity, temporal)

Color and spatial pattern

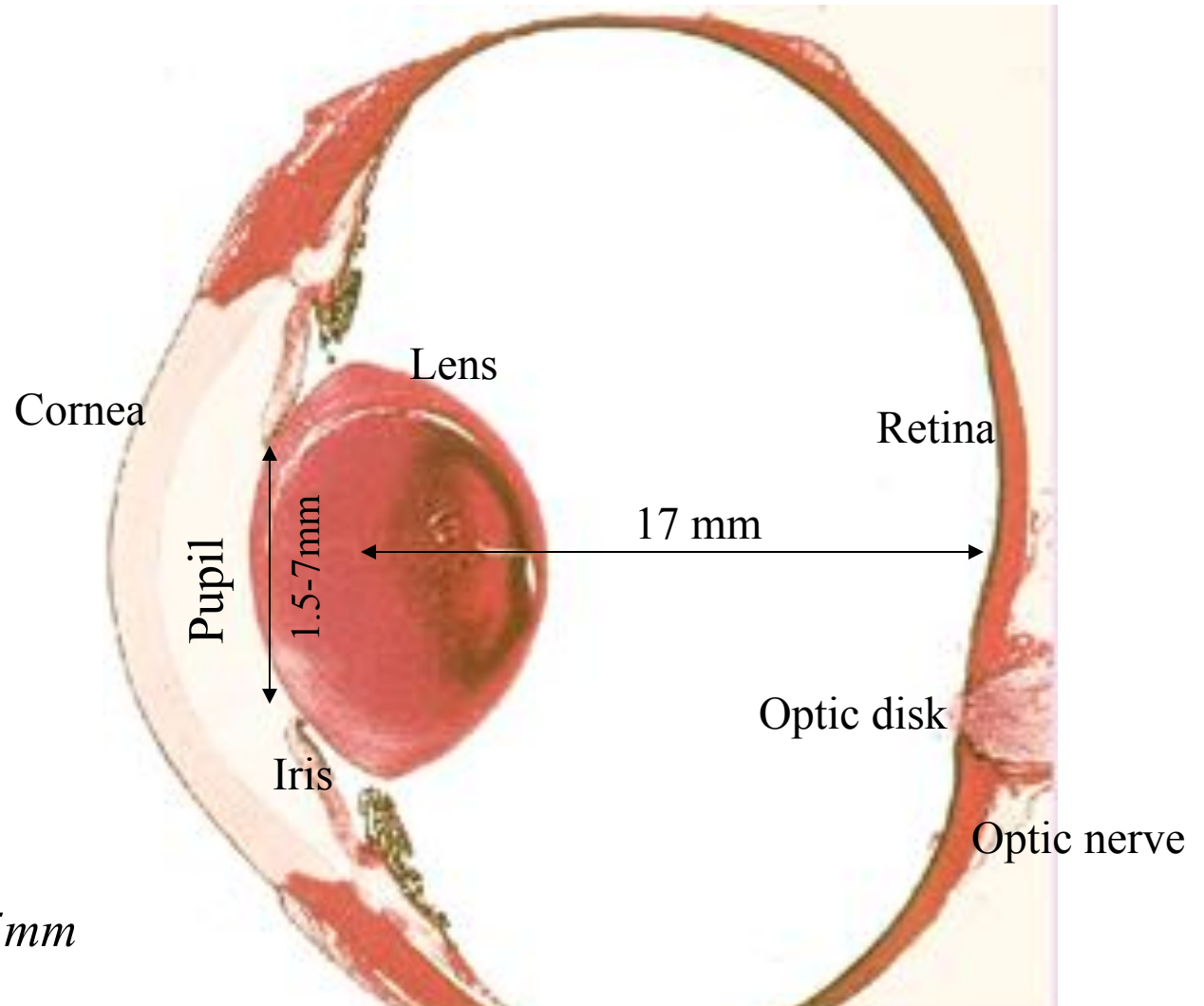
Hofer, H. et al. *J. Neurosci.*
2005;25:9669-9679

Cone inner segments 1-2
micron diameter in foveola;
much larger in the
periphery.

Foveolar edge – cone
diameter is 3-4 microns
(330 microns ~ 1 deg)



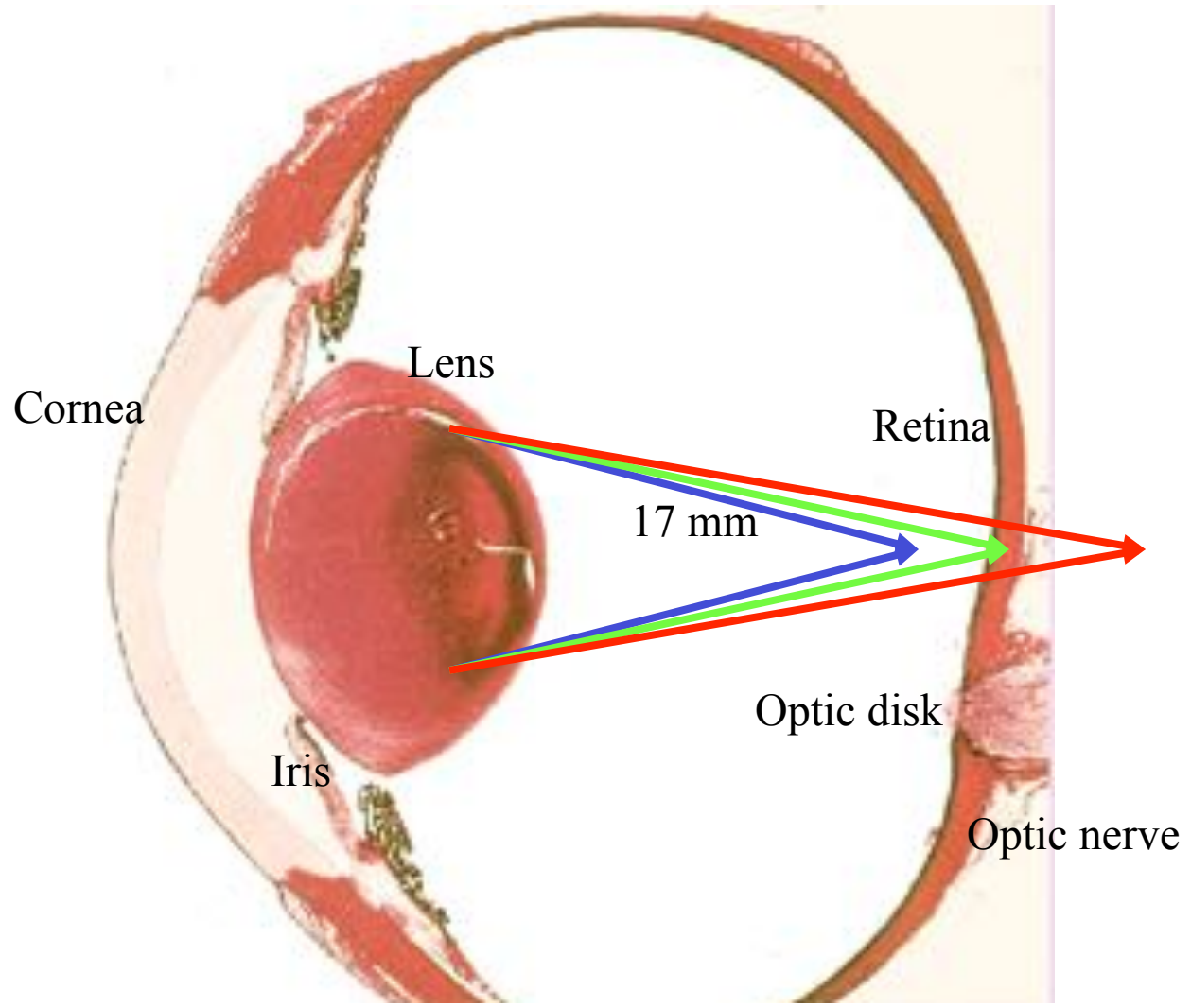
Human eye in cross- section



F-number ~ 2.4-11

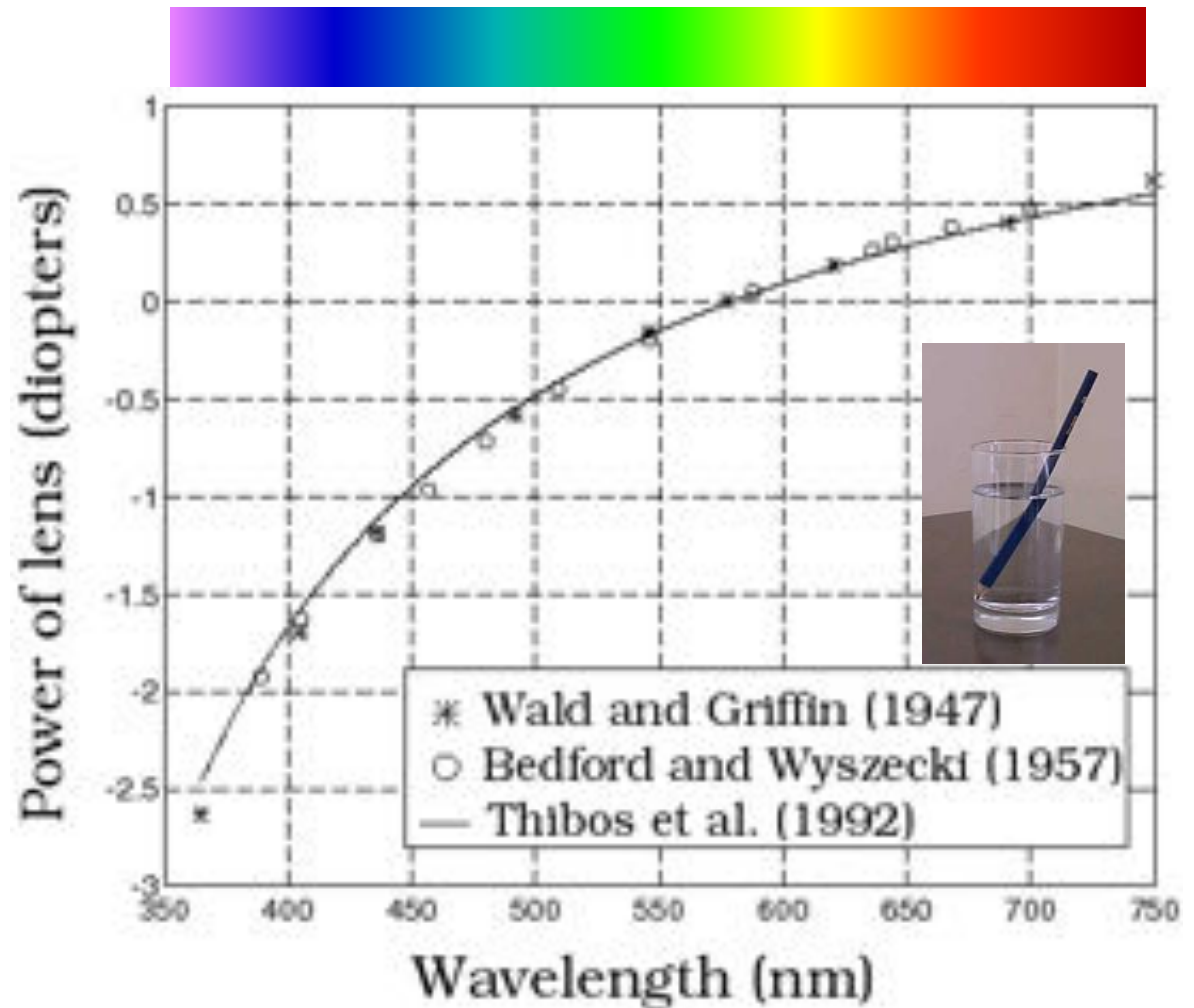
Retinal thickness ~ 0.5mm

Chromatic aberration is wavelength-dependent difference in focal length



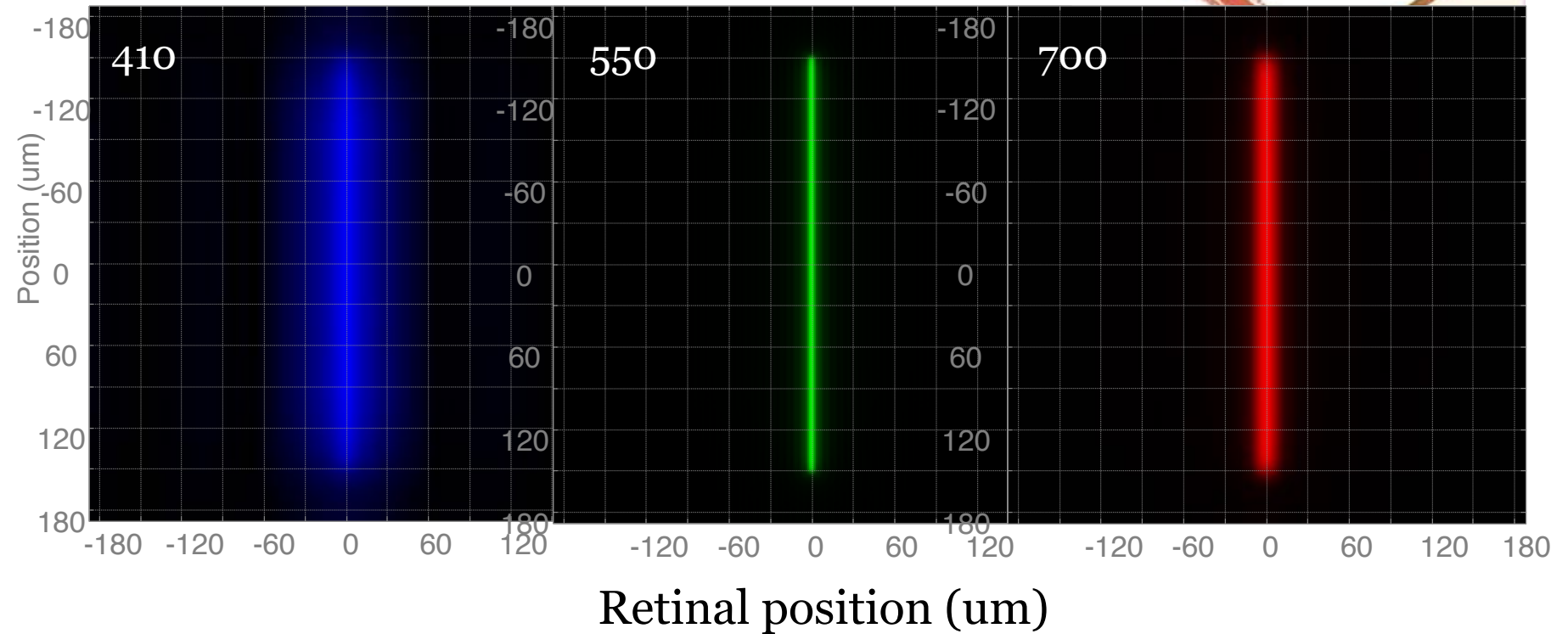
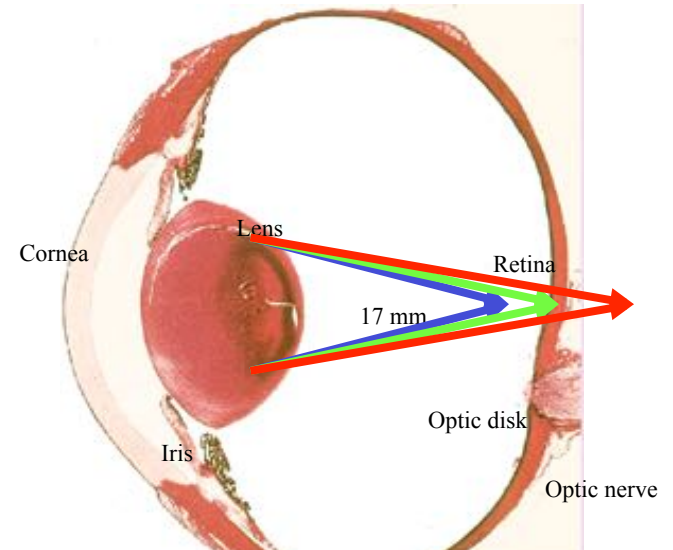
Chromatic aberration size is quantified by optical power (1/meters)

- Largest optical aberration
- Size is very similar across people



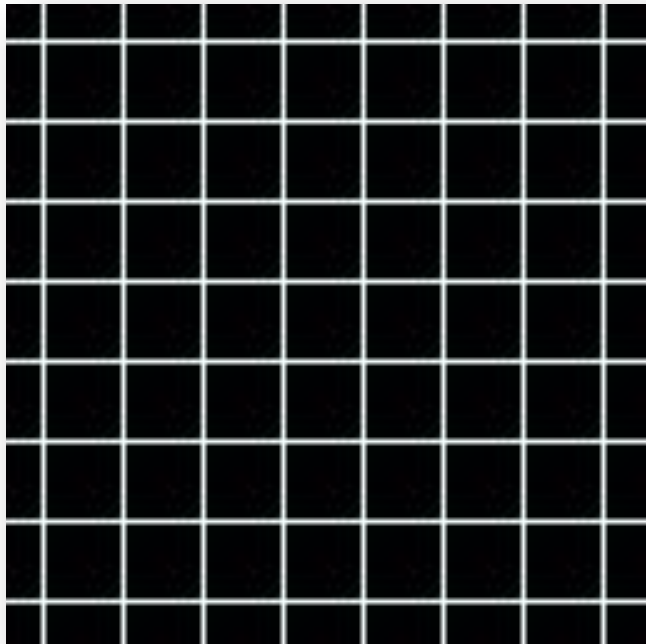
ISETBIO: t_humanLineSpread

Line spread function by wavelength

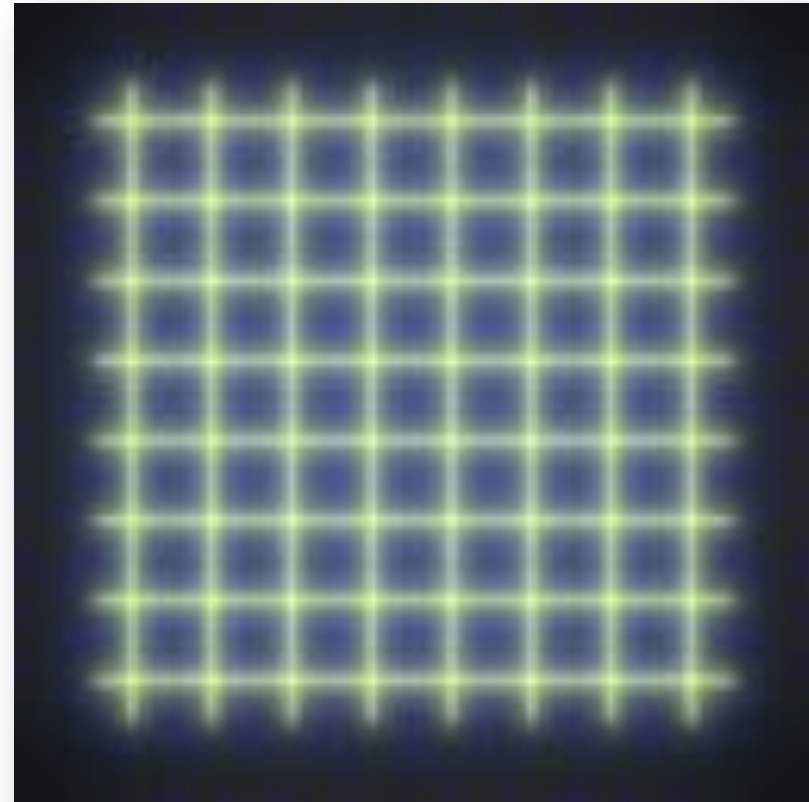
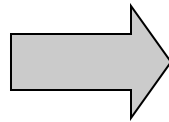


Example: Wavelength-dependent spread of a broadband light (D65)

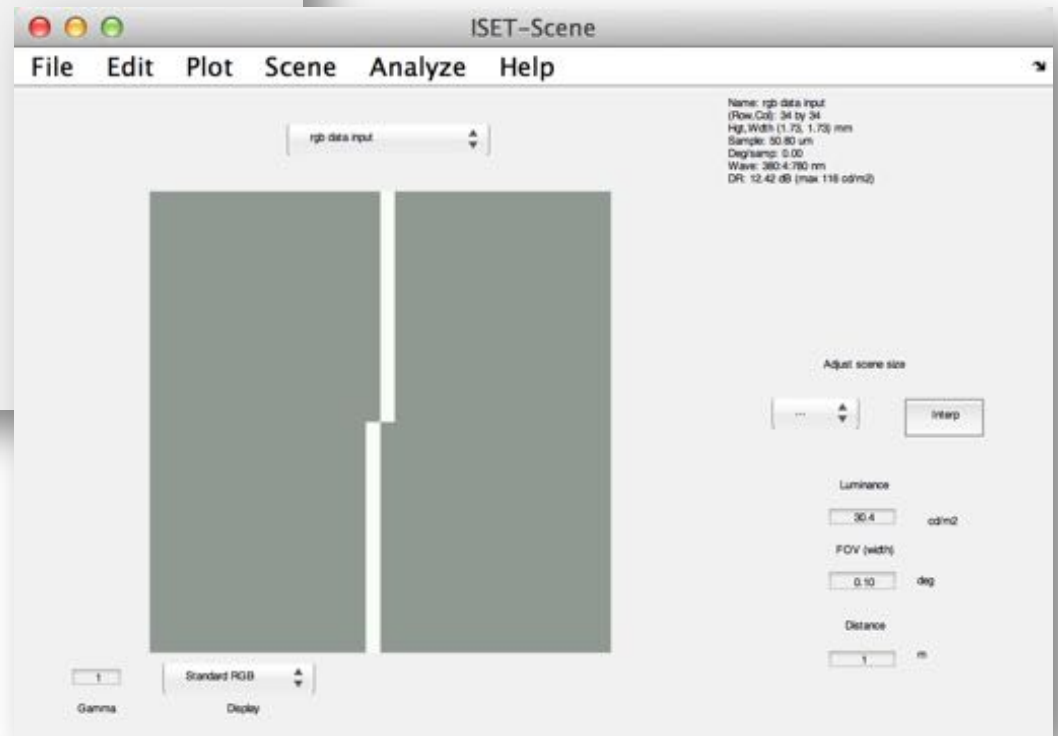
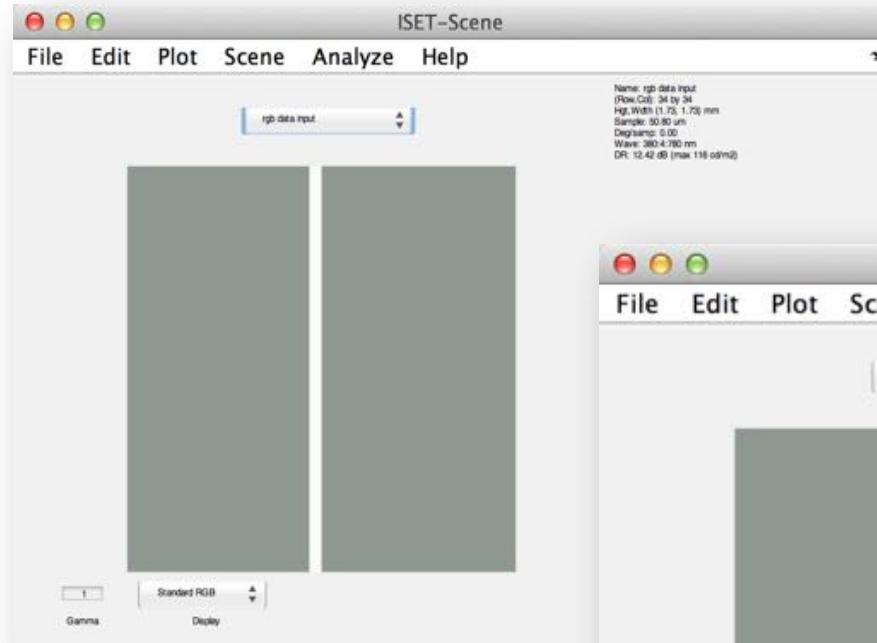
Broadband radiance produces chromatic irradiance



Human optics

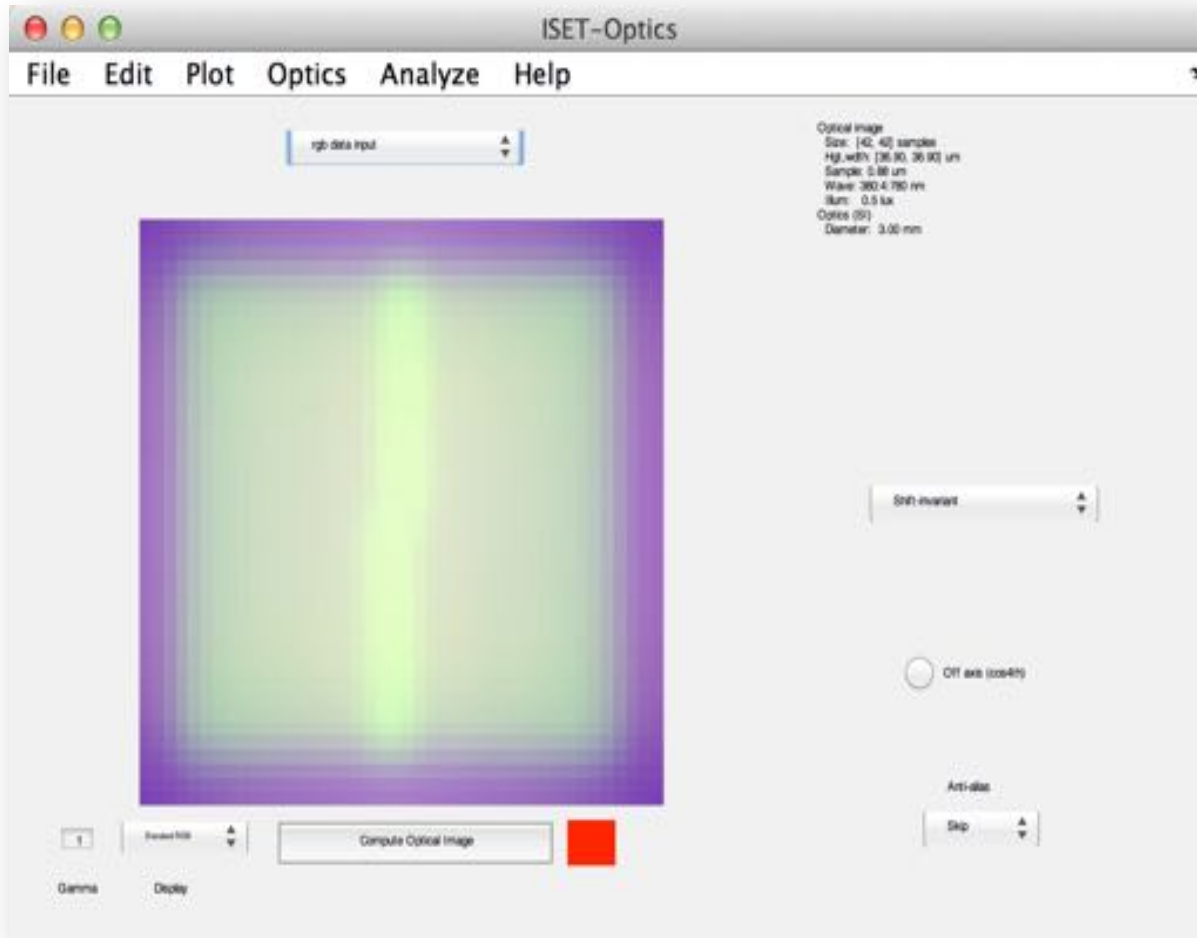


ISSETBIO: Scene radiance



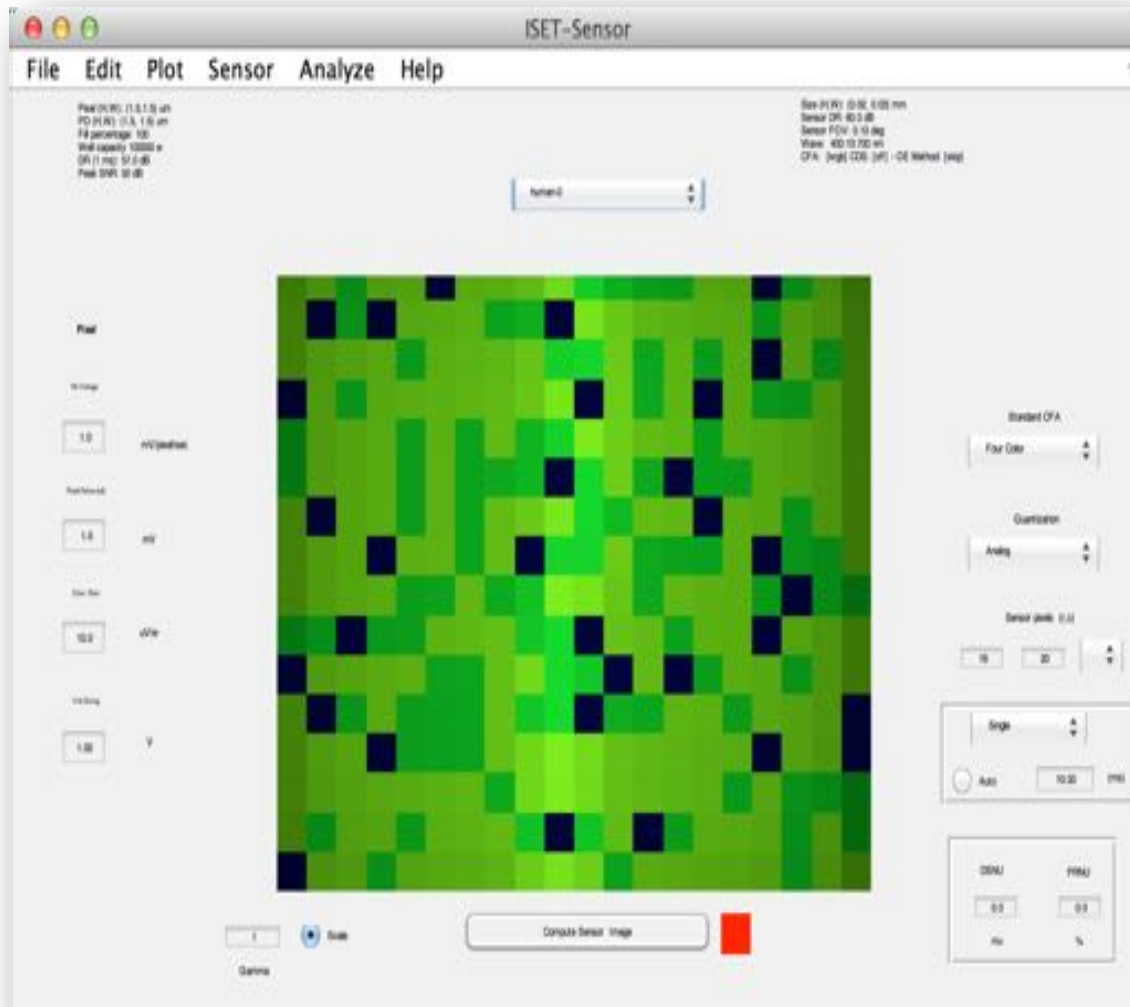
- *Vernier Acuity is an extreme task for human visual positional acuity*
- *Misalignment is smaller than the diameter of retinal receptors*

Optical image (irradiance)



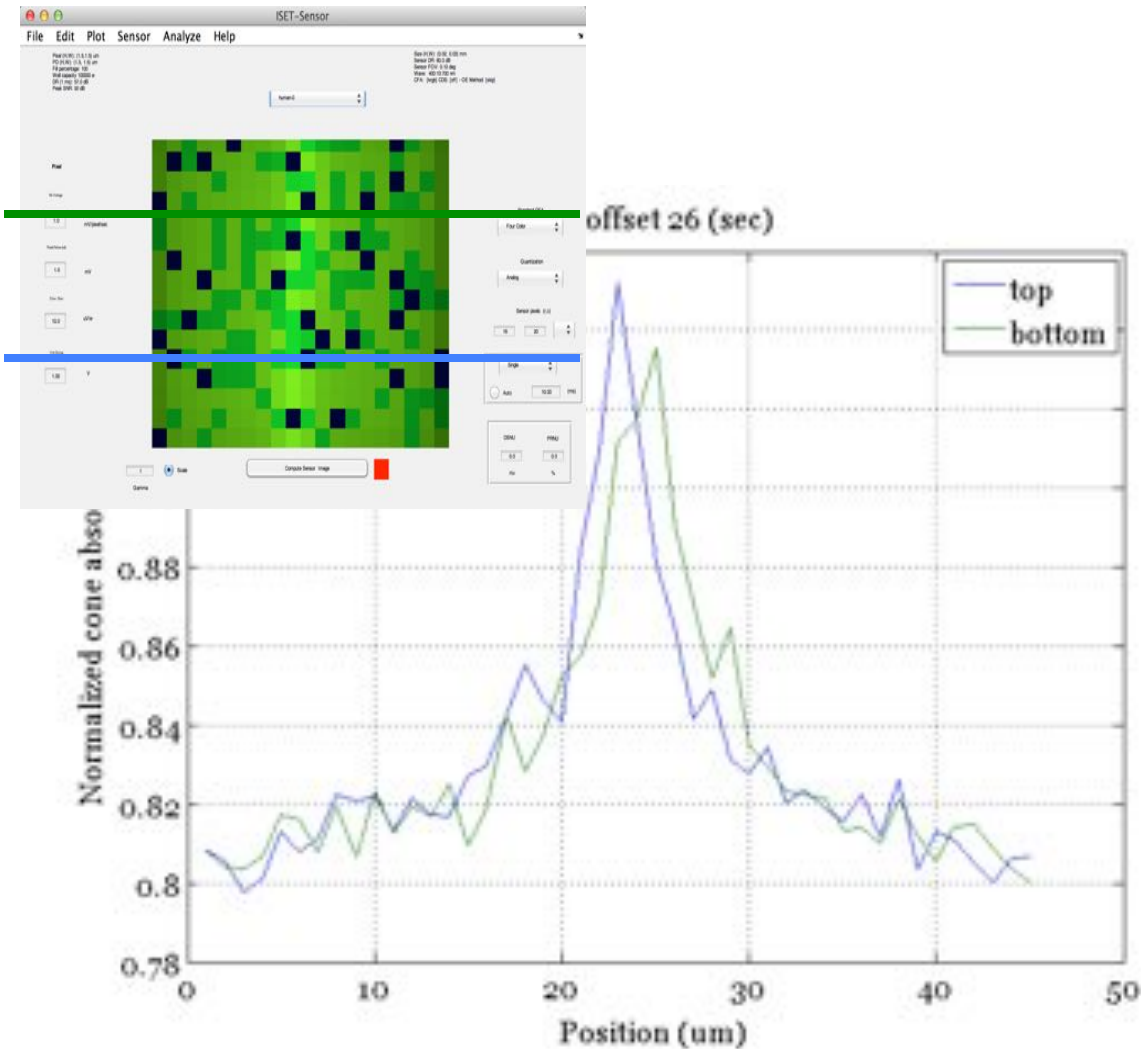
- Irradiance image blurred by human eye, lose some spatial frequency information
- Chromatic aberration
- Differs in eyes of different groups of people (astigmatism, presbyopia, etc.)

Sensor (cone absorptions)



- Compute expected number of photons to be absorbed by each retinal photo receptor
- Photon noise is added to generate a bunch of samples
- Non-additive noise (e.g. eye movement) is considered

Cone vernier resolution

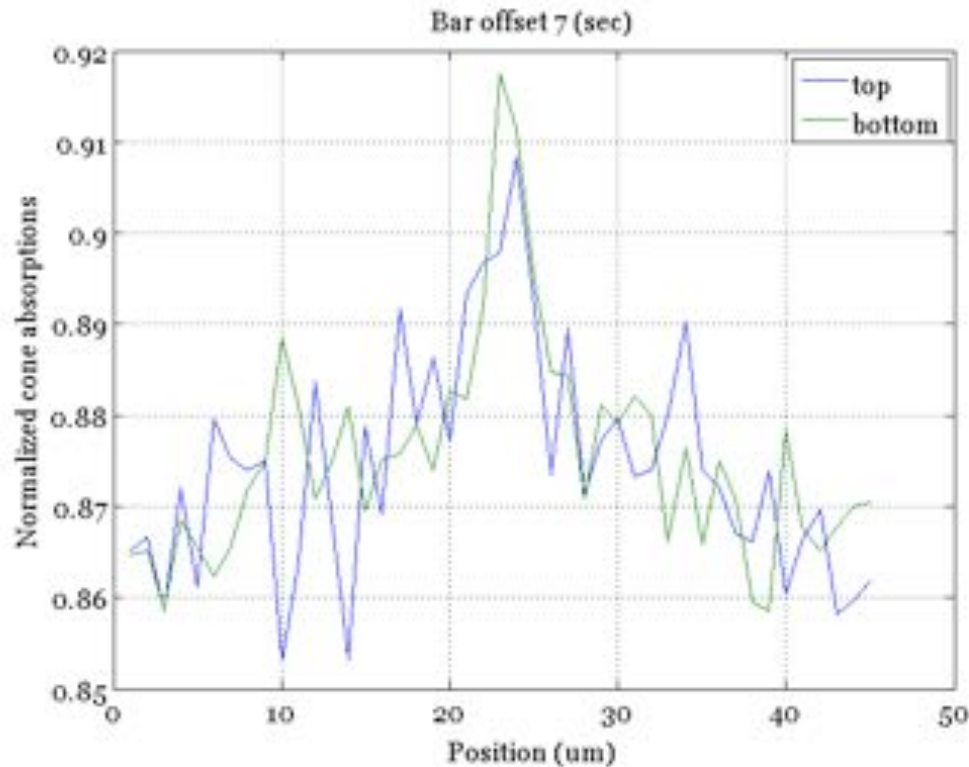


Display 200 dpi

M-cone spacing –
1.5 um

Compare no noise
and photon noise
only

Cone vernier resolution

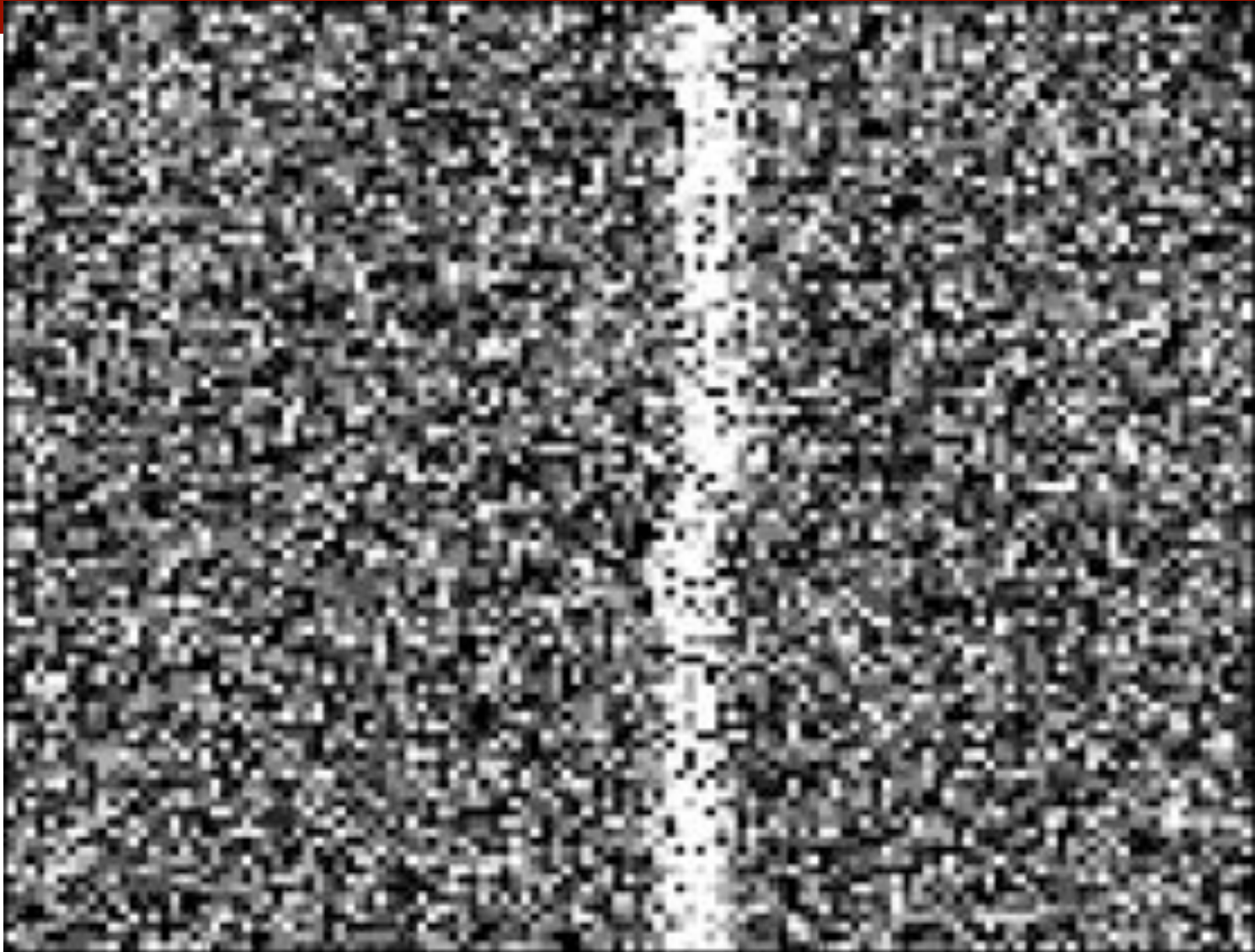


Display 800 dpi

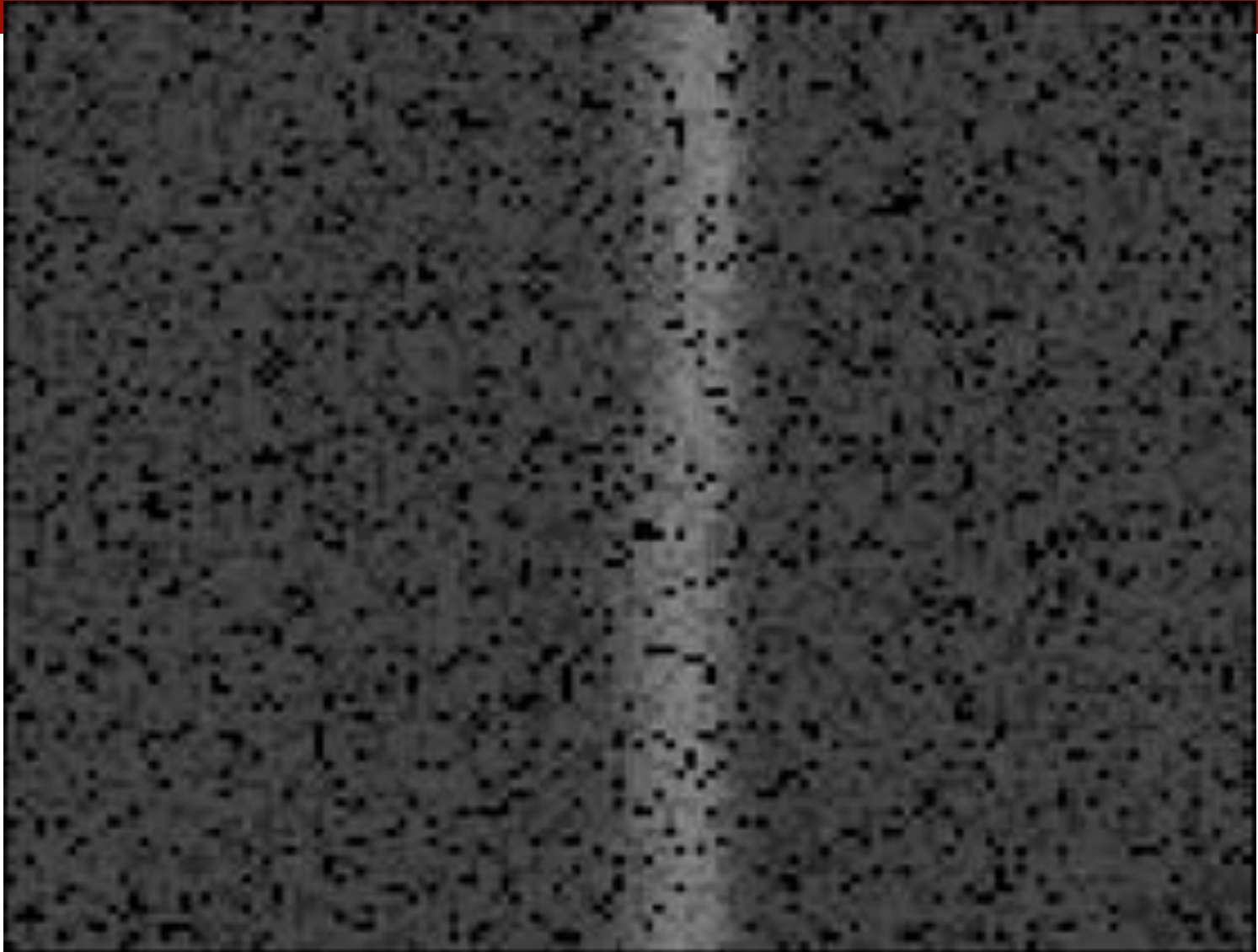
M-cone spacing –
1.5 μm

Compare no noise
and photon noise
only

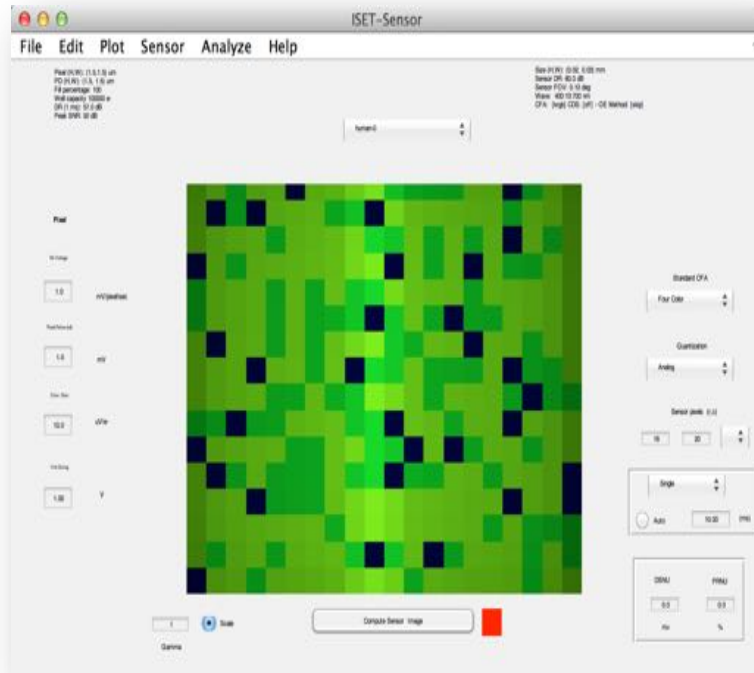
Photon absorptions



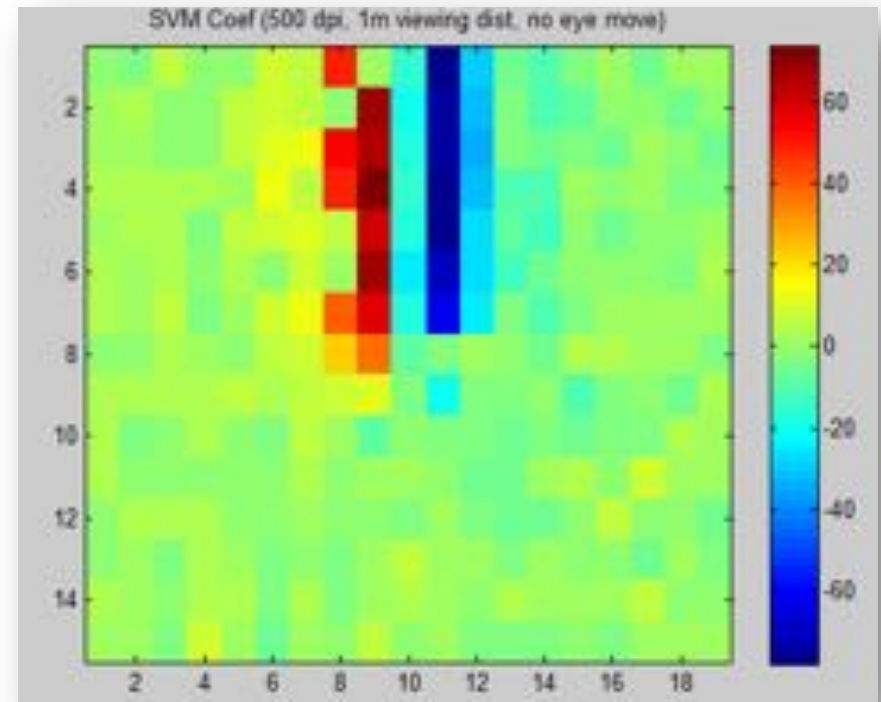
Cone adaptation model (Rieke)



Classifier (Support vector machine)



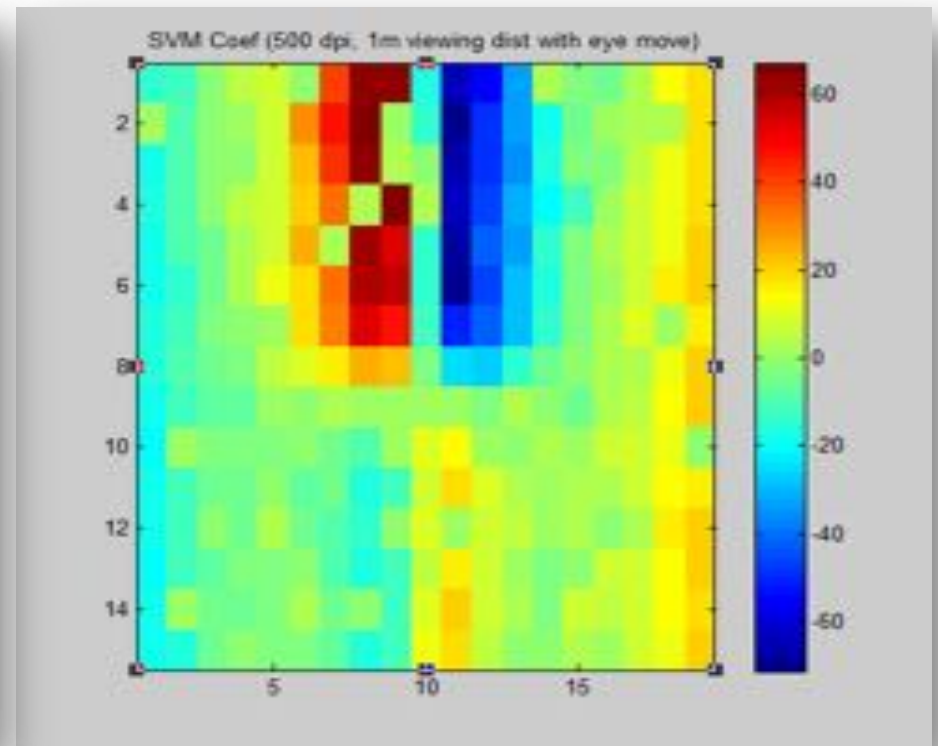
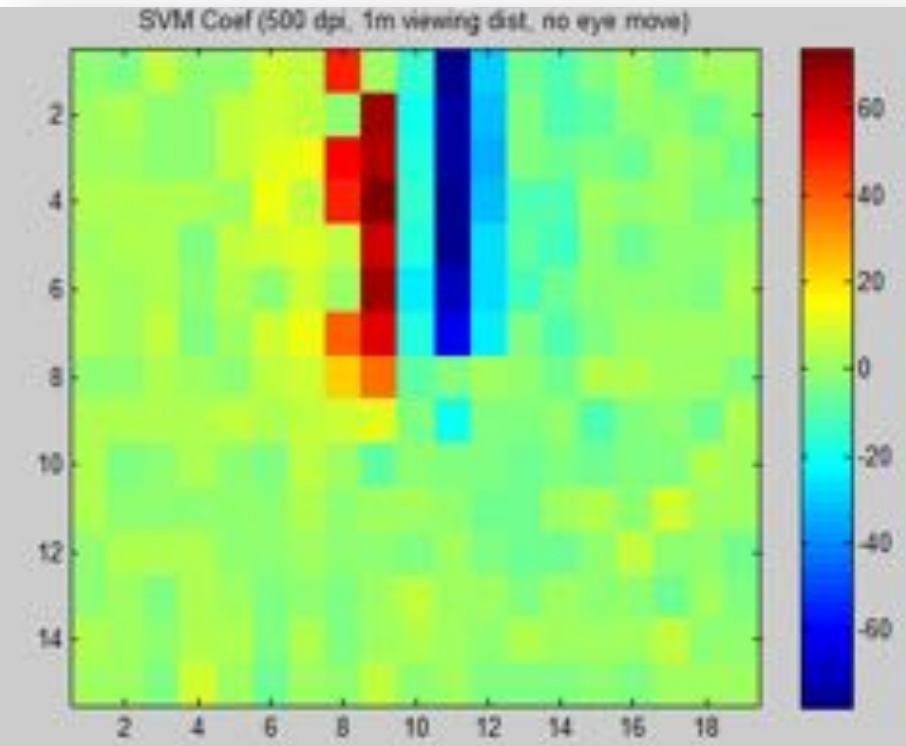
- Machine learning methods find spatial structure that can be used to decide offset vs. aligned



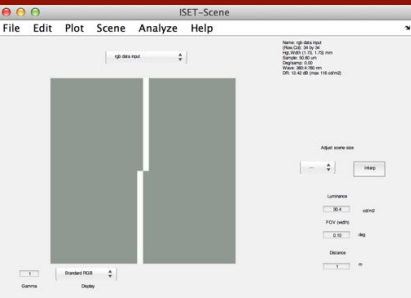
Classifier (SVM)

No eye movements

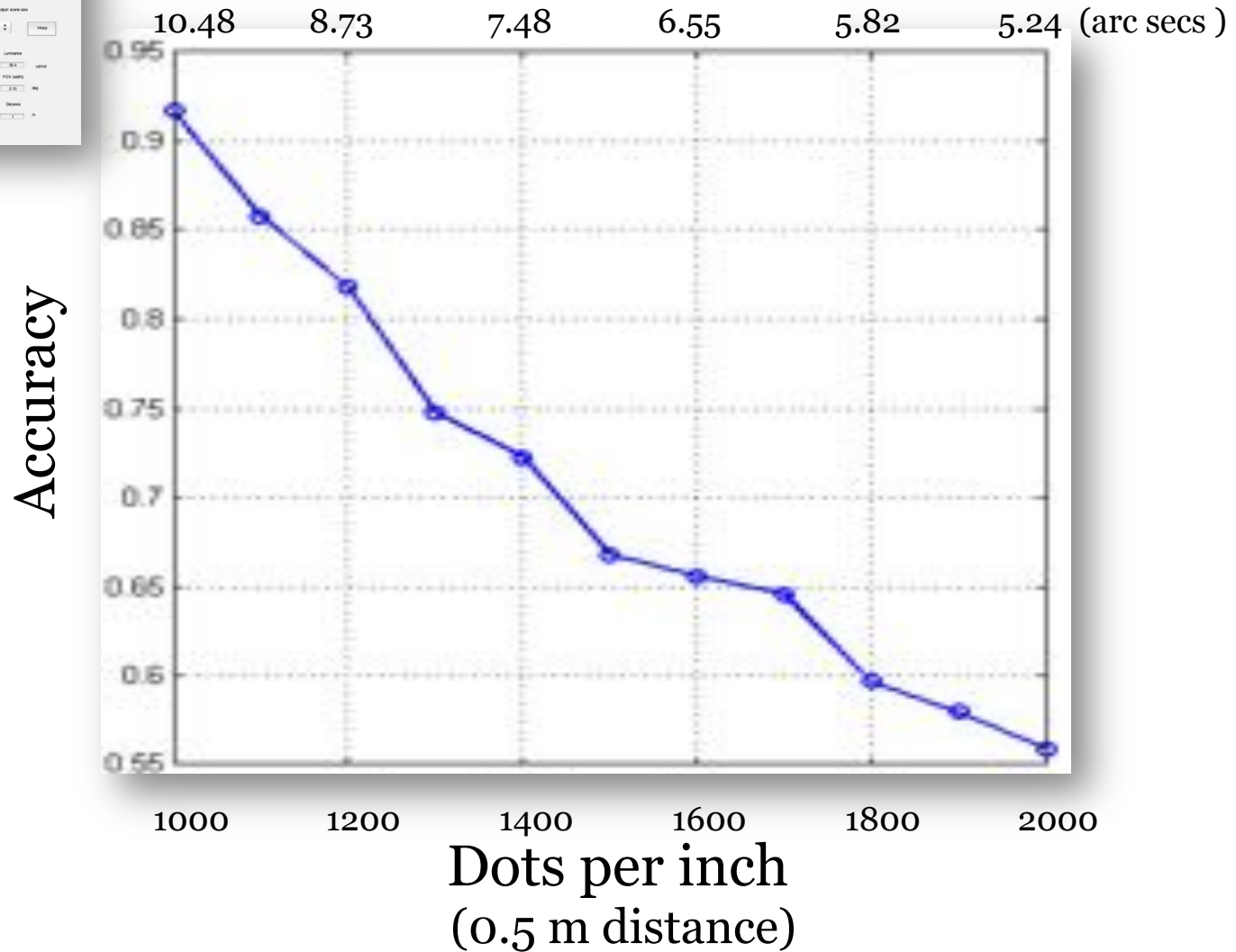
With eye movements



Used for engineering applications



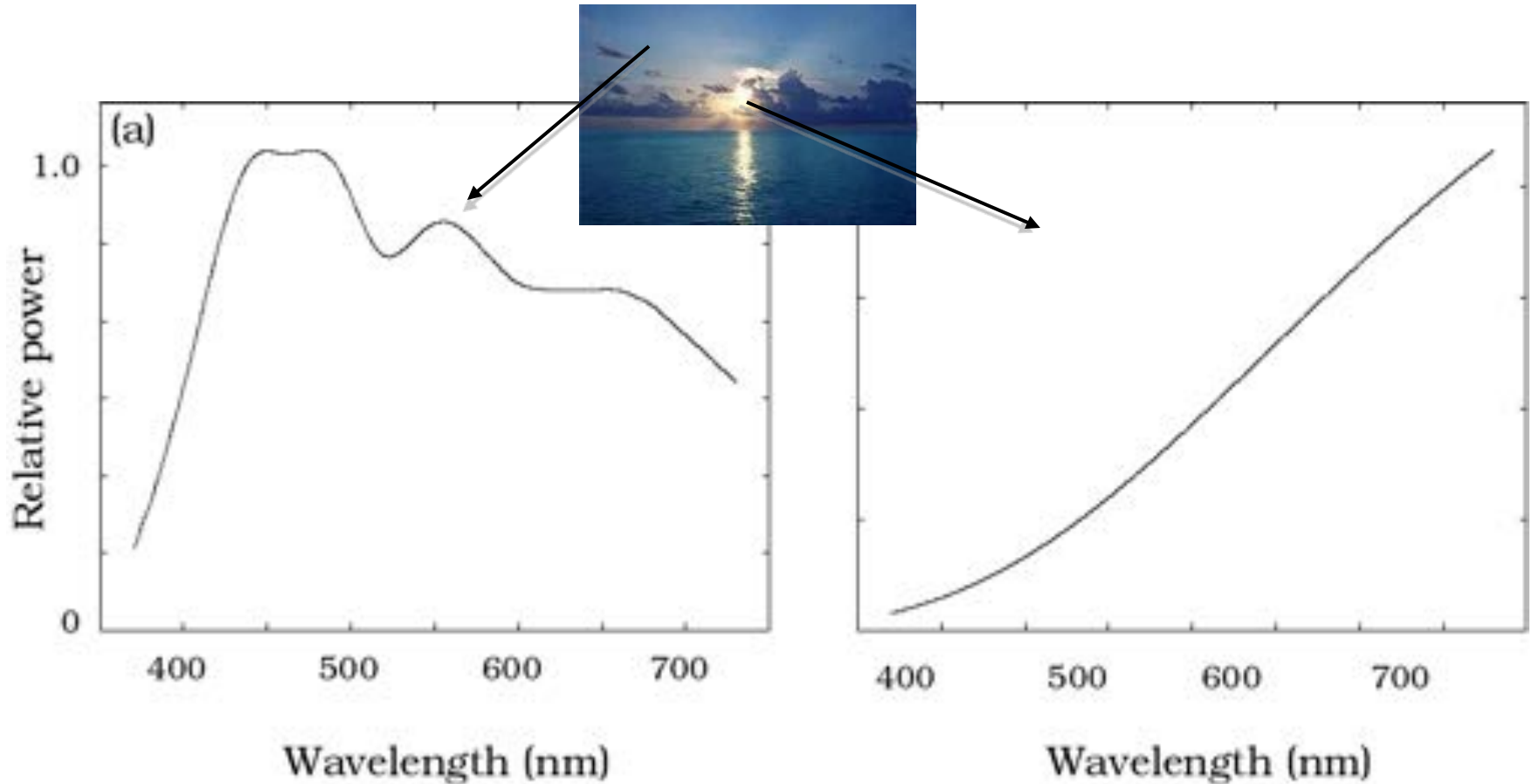
SVM on vernier acuity



Context, pattern, and color for Engineering



An important context: Ambient lighting

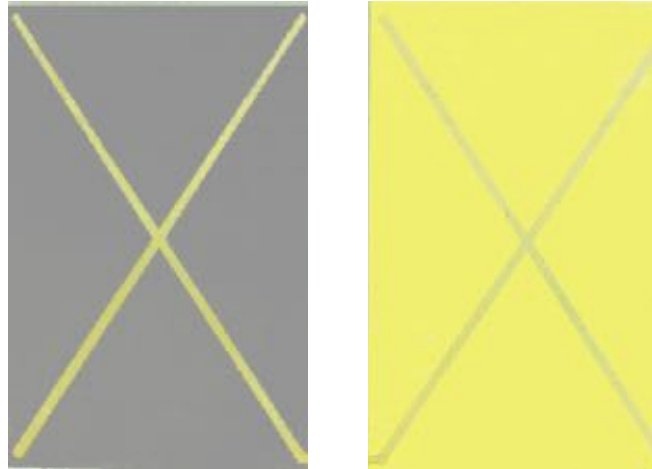


SPD: spectral power distribution

Color appearance and context



Color appearance and context



... passing then into another place illuminated by sunlight, if one looks through the door of the room, the objects that are lit by candlelight will appear tinted reddish-yellow in comparison with those lit by the sun and seen concurrently. One cannot appreciate this when he is in the candle-lit chamber.

(De La Hire, 1694/1730)

Lightness Perception (Lotto and Purves)



Judgments of lightness

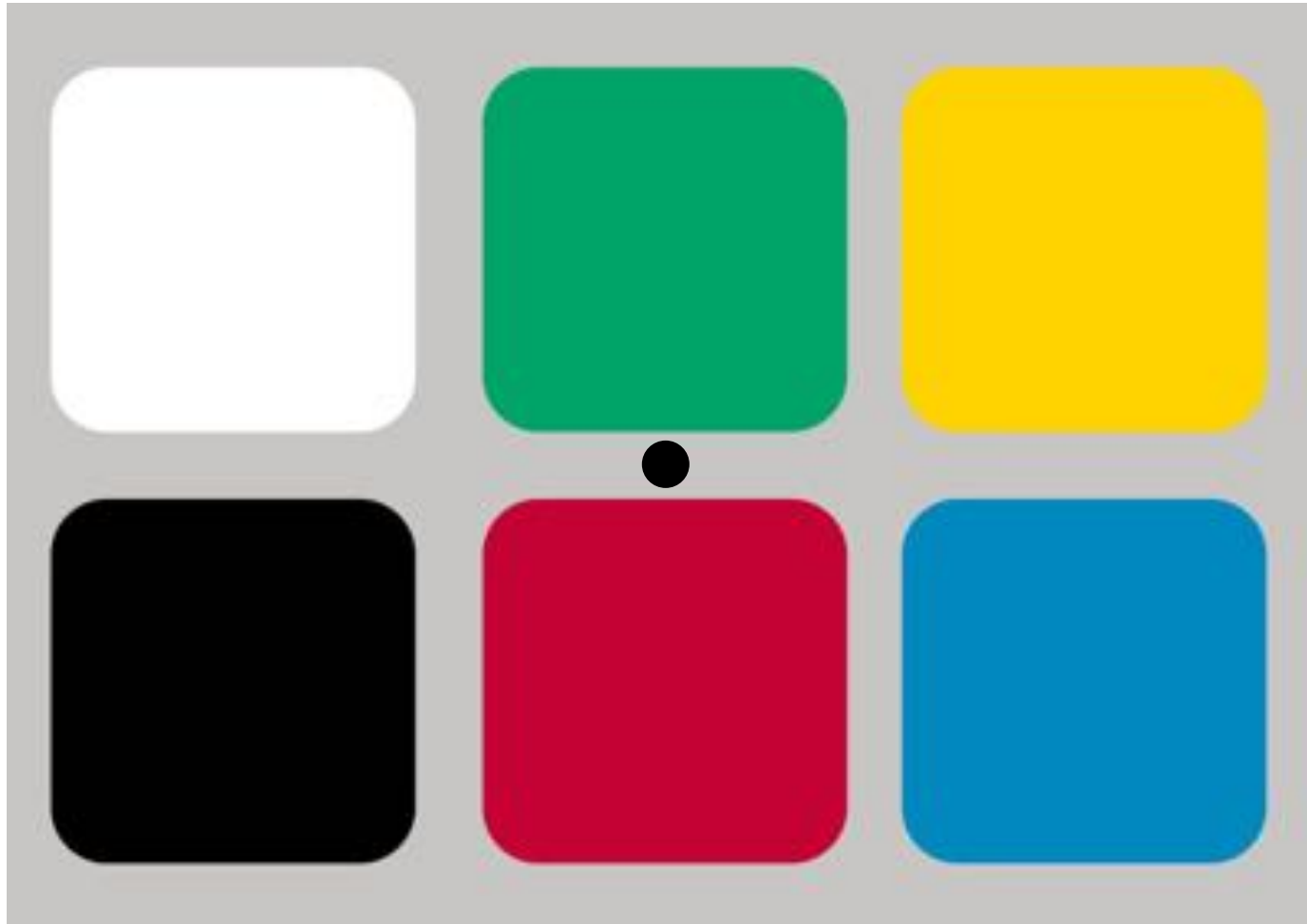
(Anderson and
Winawer, Nature,
2005)



Opponent-colors

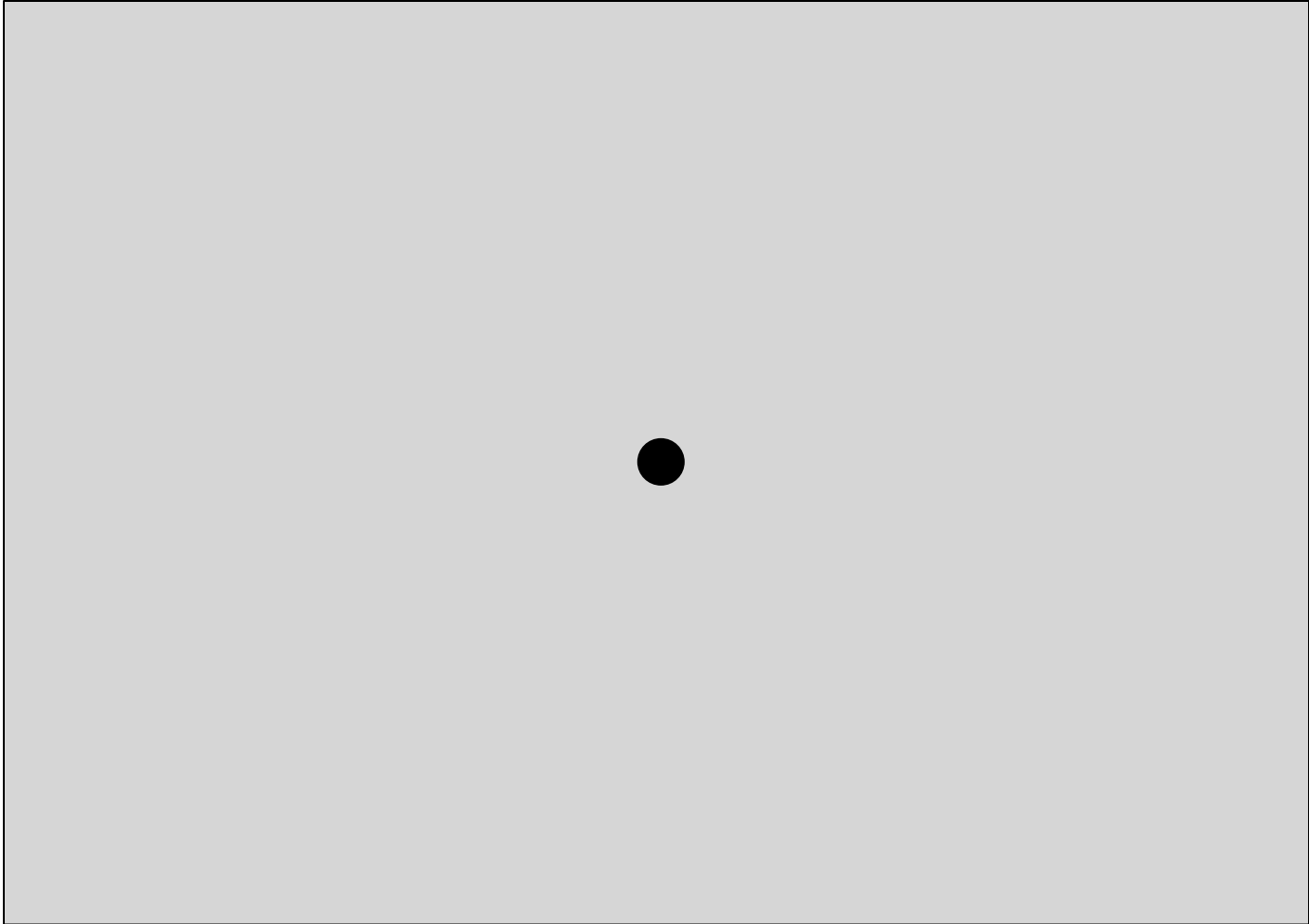


Opponent-colors – Afterimage demo



White
Green
Yellow

Black
Red
Blue



White
Green
Yellow

Black
Red
Blue



johnsadowski.com



keep staring at the black dot.



johnsadowski.com

Thanks to the people who did the work

