

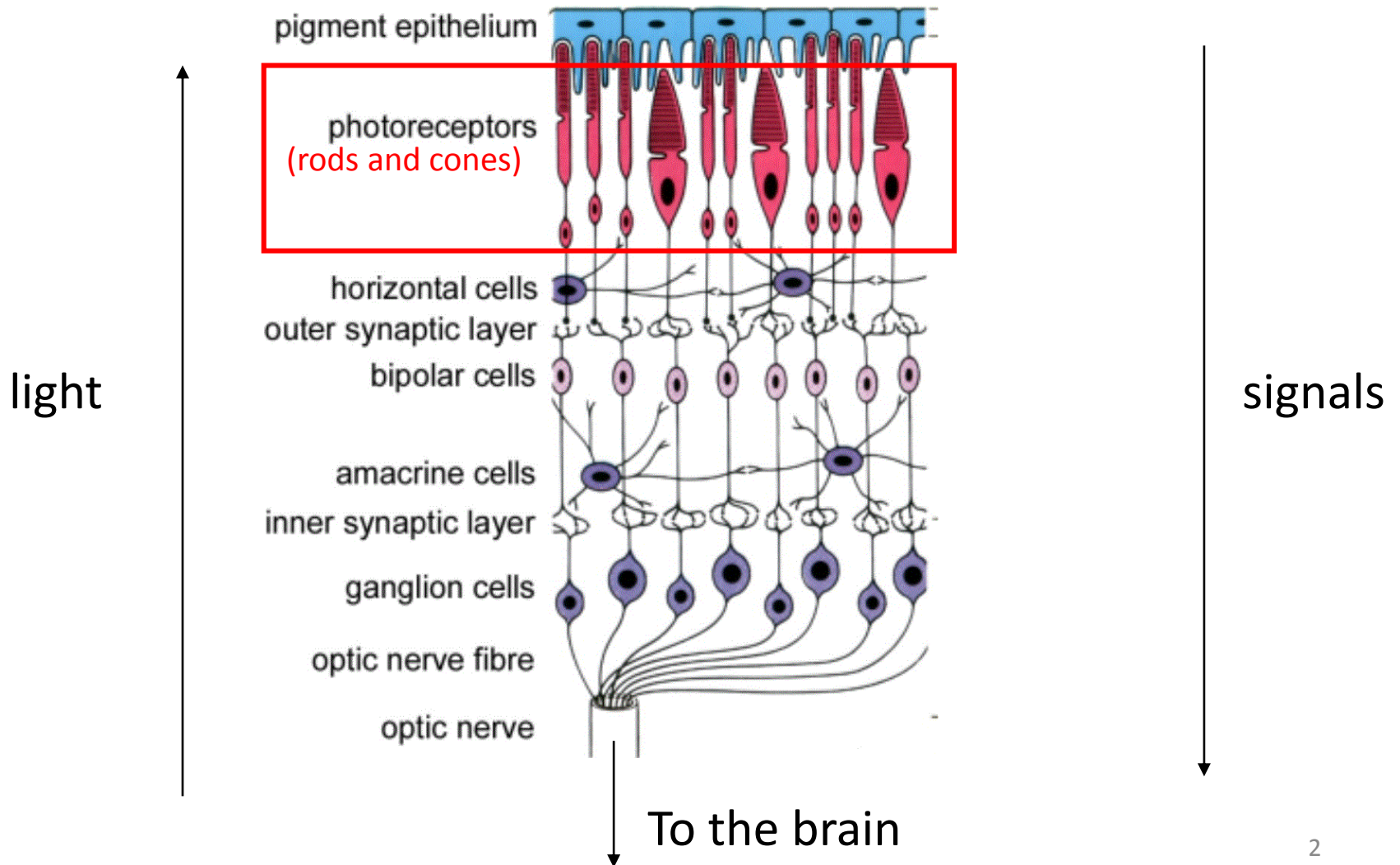
COMP 546

Lecture 4

Retina

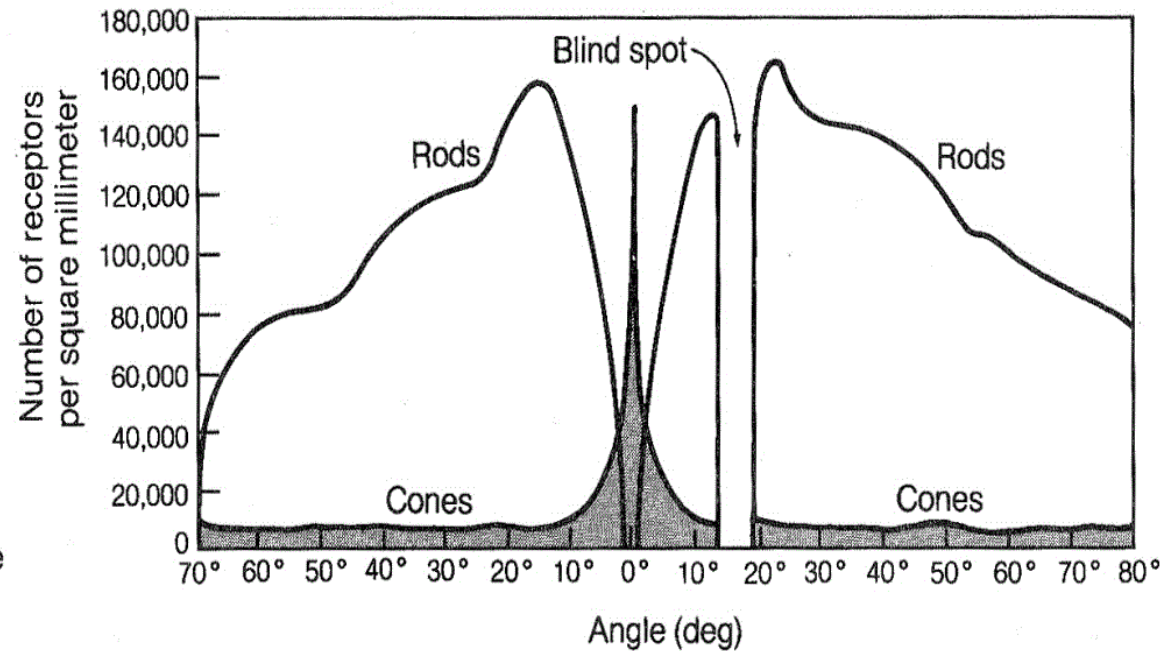
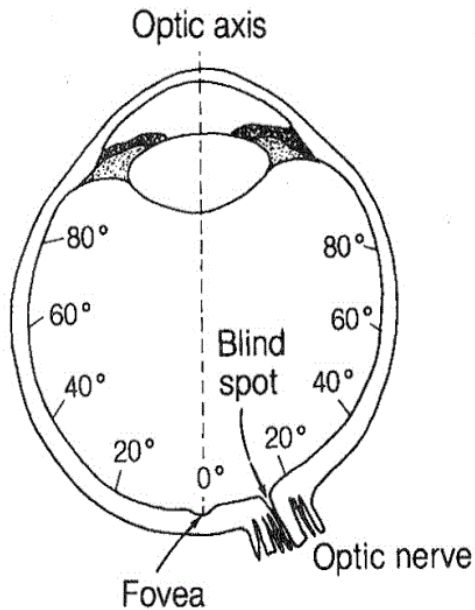
Tues. Jan. 23, 2018

# Layers of the Retina



# Photoreceptor (rod and cone) density

This is the left eye. Why?

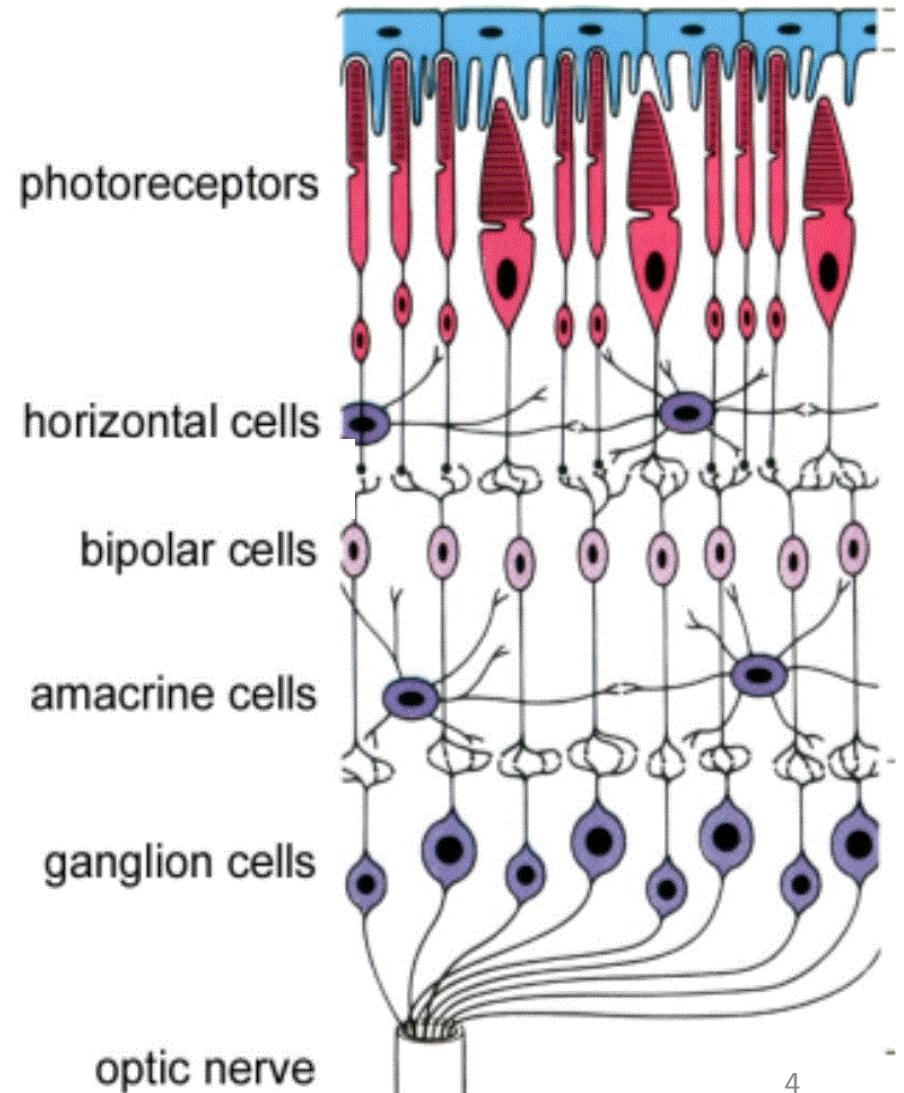


Cone density is very high in the center of the field of view.  
This area of the retina is called the *fovea*.

# Responses of cells in the Retina

continuous

discrete (“spikes”)



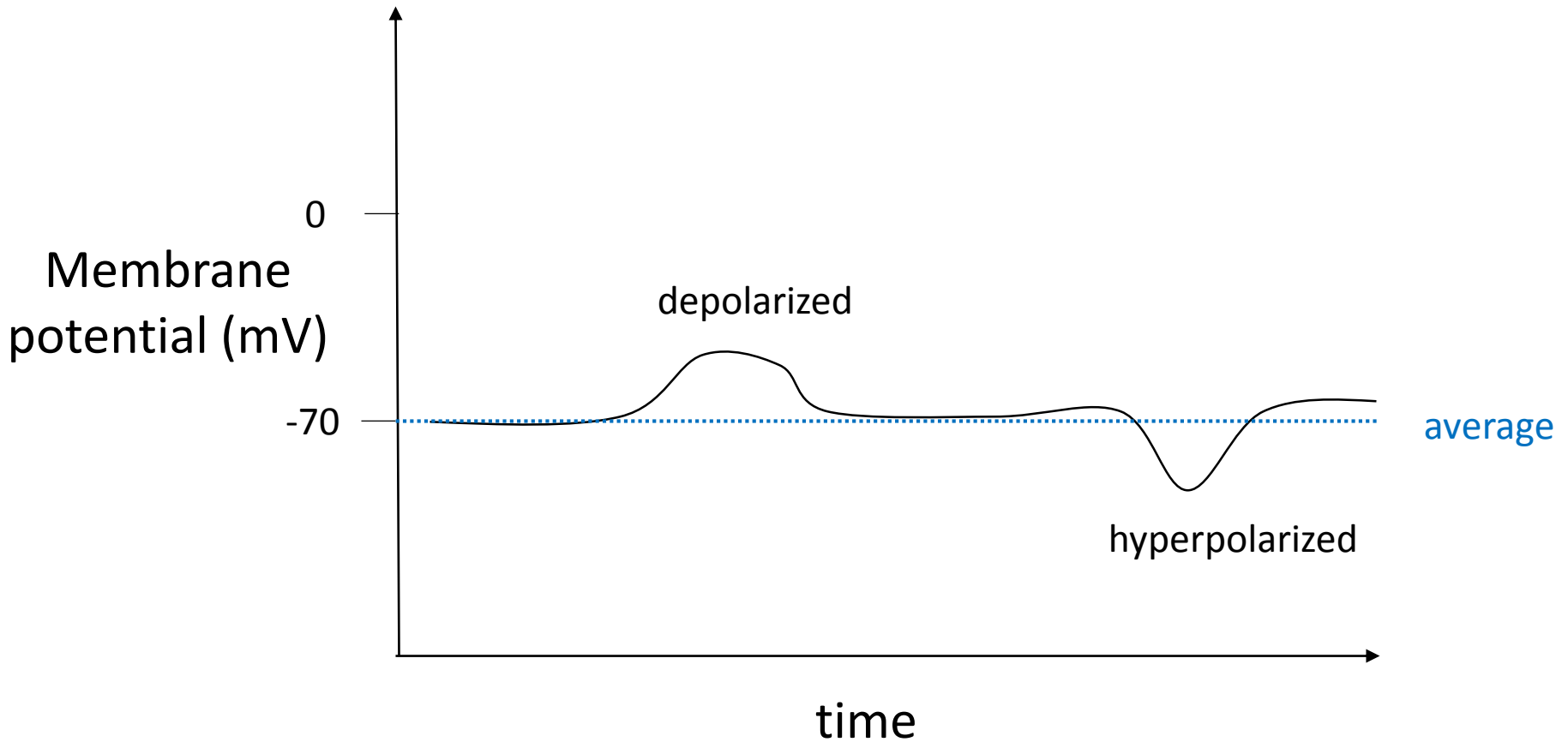
ASIDE:

neural coding using spikes

(retinal ganglion cells)

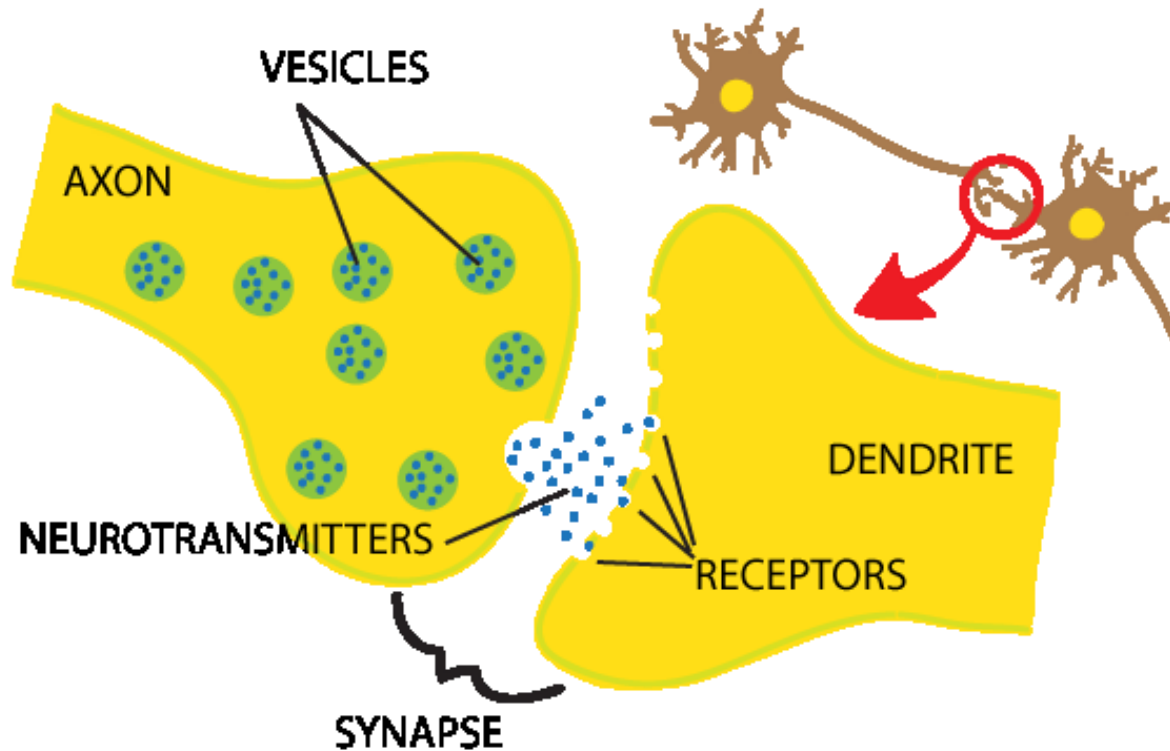
I mentioned this in lecture 0.

# Response of neuron (measured by experimenter)



# Signalling between cells at synapse

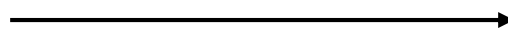
(not measured by experimenter)



Release rate of neurotransmitters depends on the membrane potential.

Neurotransmitters can be either excitatory (depolarizing) or inhibitory (hyperpolarizing).

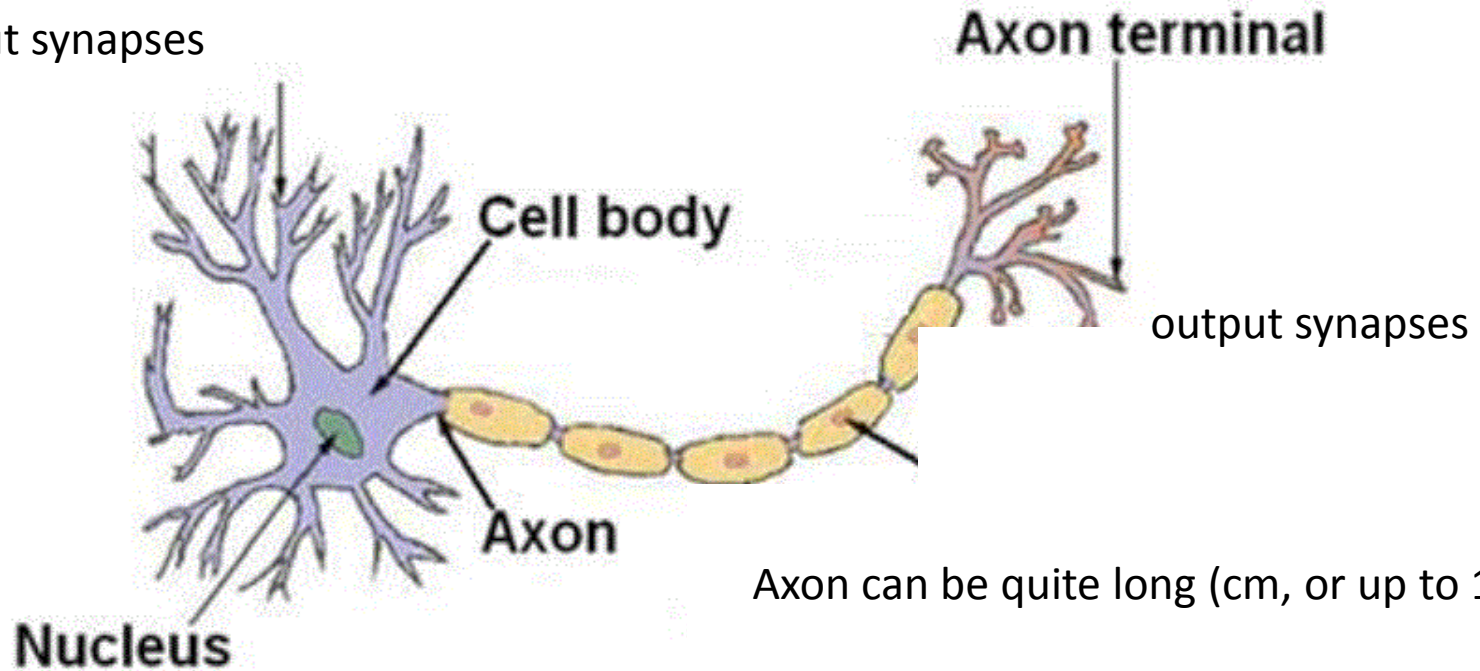
pre-synaptic cell



post-synaptic cell

Q: How do nerve cells signal over long distances ?

input synapses

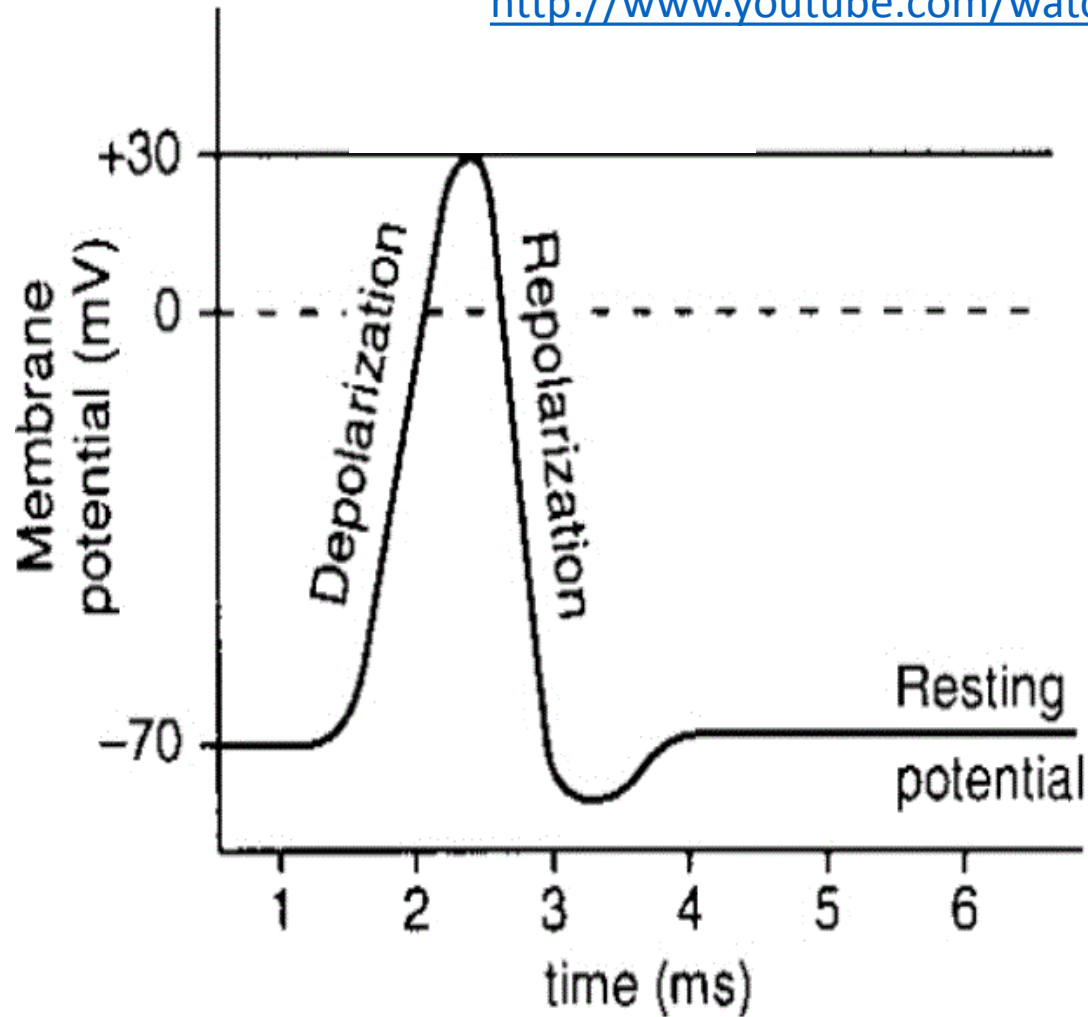


Axon can be quite long (cm, or up to 1 m).



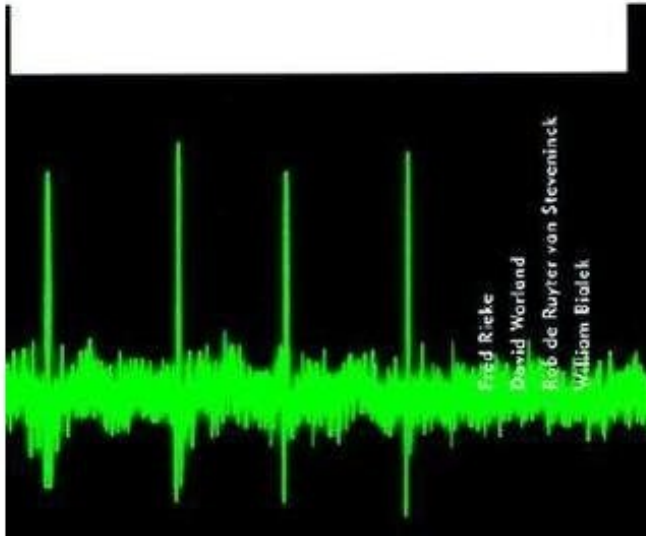
# A: Spikes (“Action Potentials”)

<http://www.youtube.com/watch?v=ifD1YG07fB8>



# SPIKES

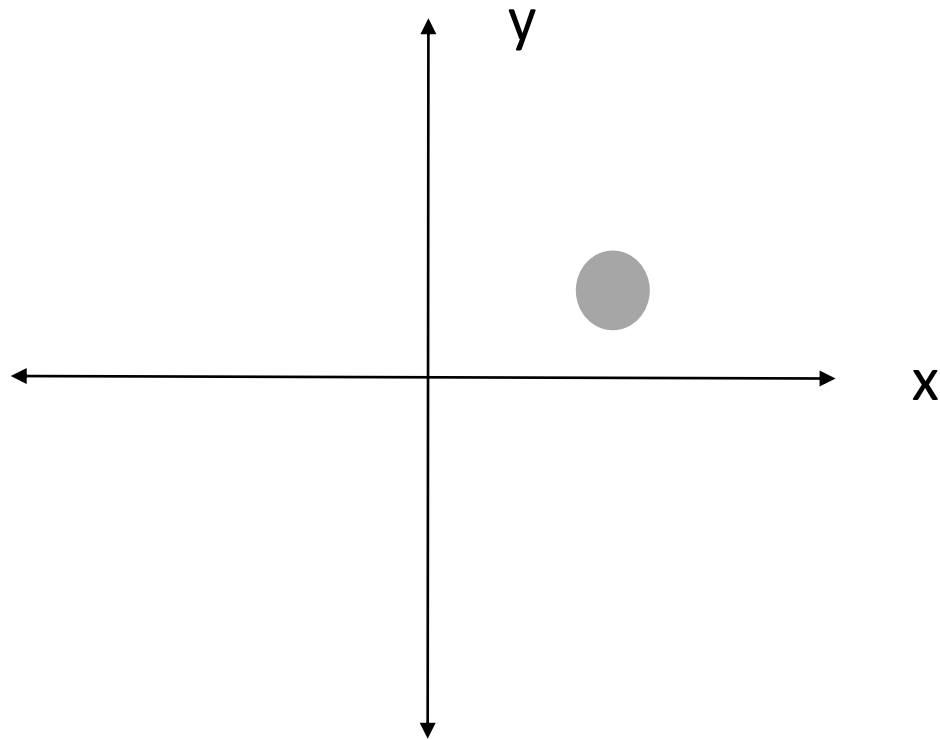
EXPLORING THE NEURAL CODE



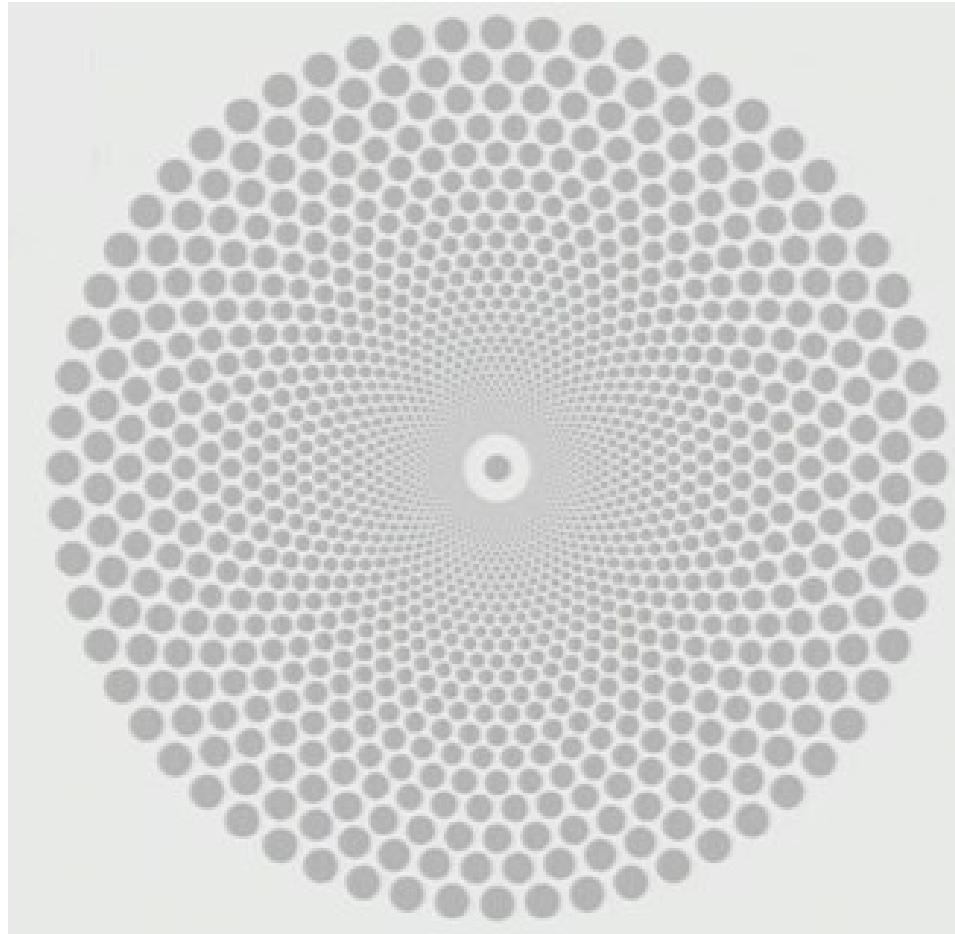
- shape
- speed
- frequency (“firing rate”)
- information (see book)

<https://mitpress.mit.edu/books/spikes>

# Receptive Field of a Retinal Cell

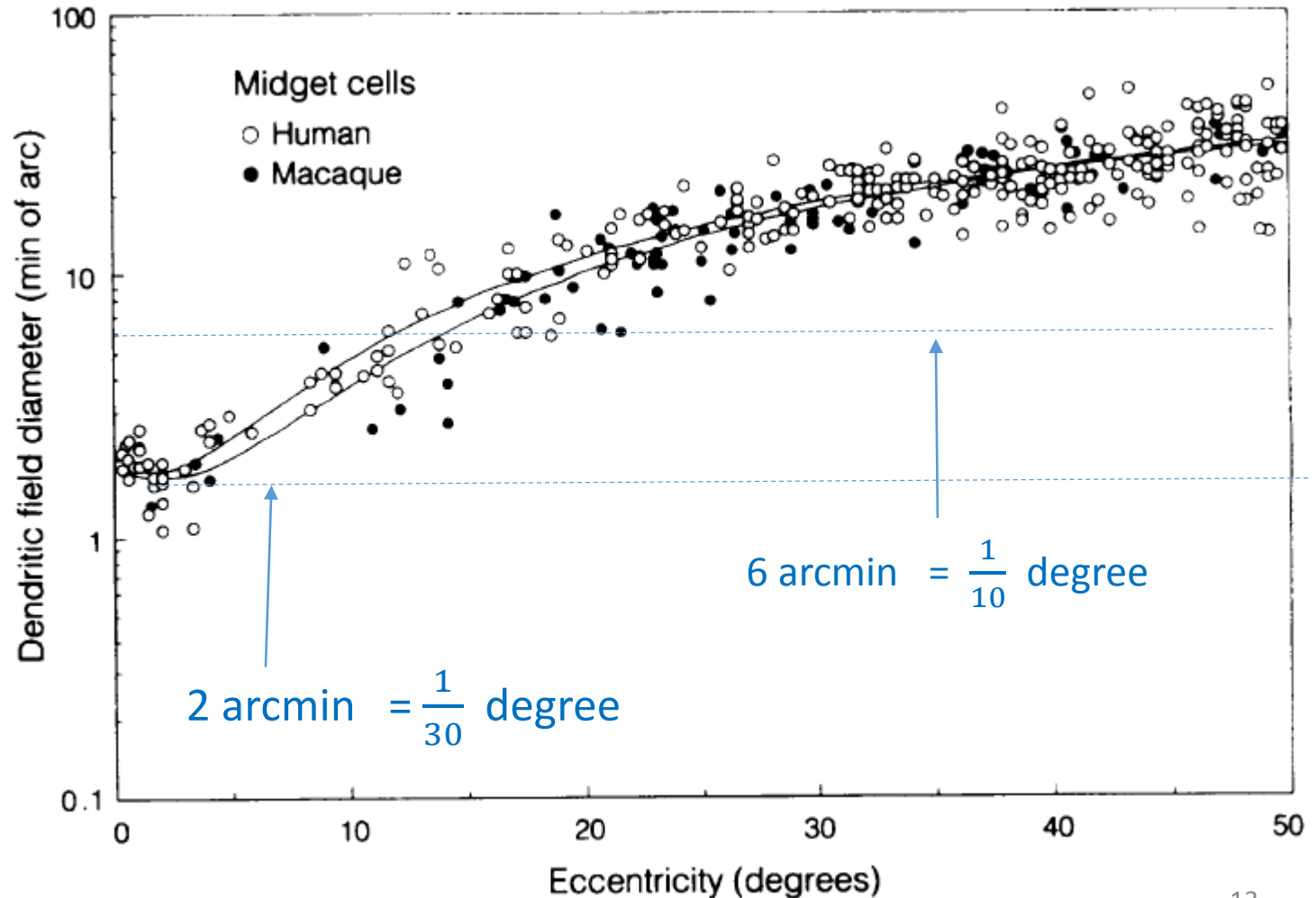


# Receptive field sizes increase with eccentricity



# Receptive field diameter of retinal ganglion cells

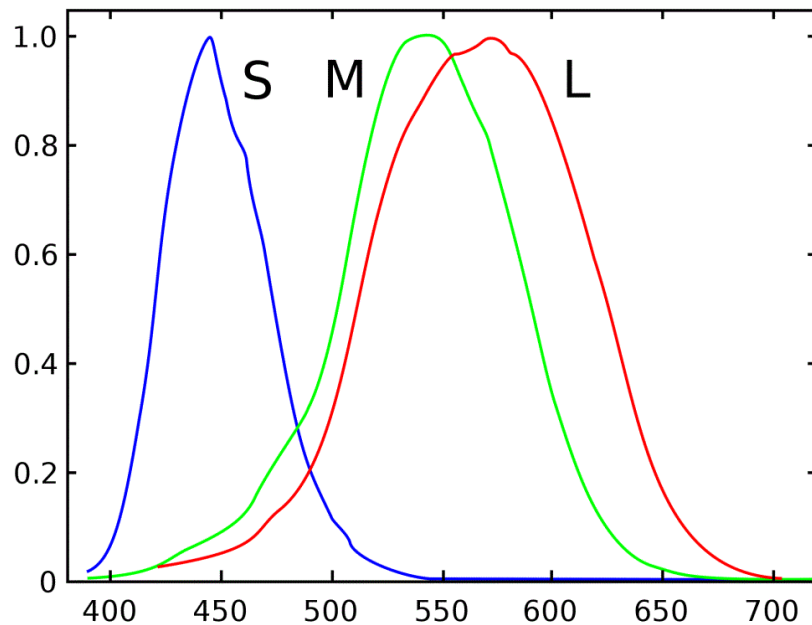
NOTE:  
Log scale



# Retinal ganglion cells encode image sums and differences :

- spectral (wavelength  $\lambda$ ) , “chromatic”
- spatial (x,y)
- temporal (t)
- spectral-spatio-temporal ( $\lambda, x, y, t$ )

# Spectral sums and differences



“L + M”

red + green = yellow

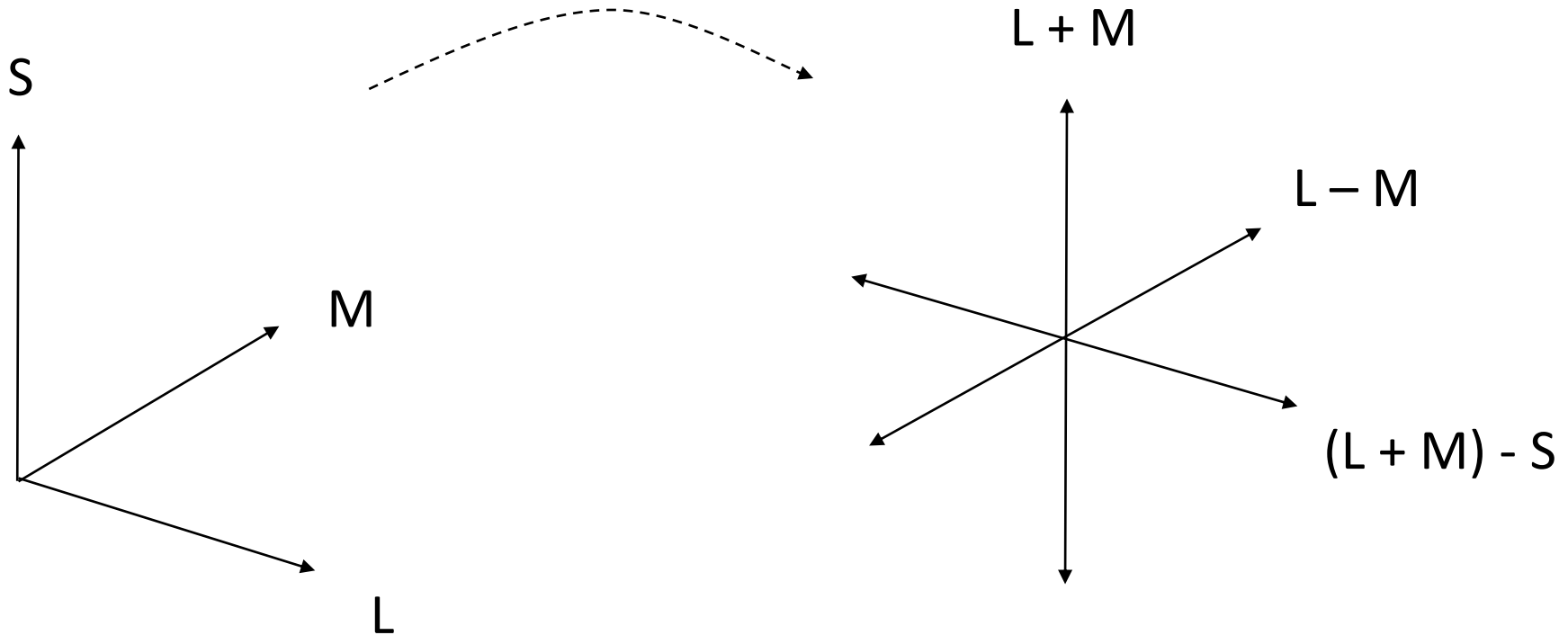
“L - M”

red - green

“(L + M) - S”

yellow - blue

# Spectral sums and differences

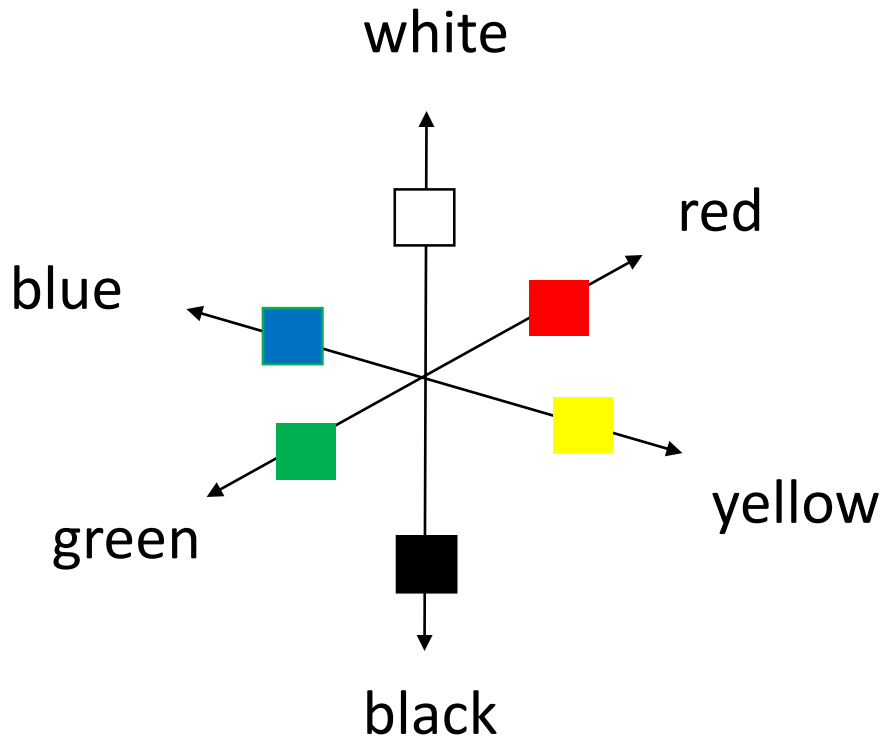


Photoreceptors (cones)

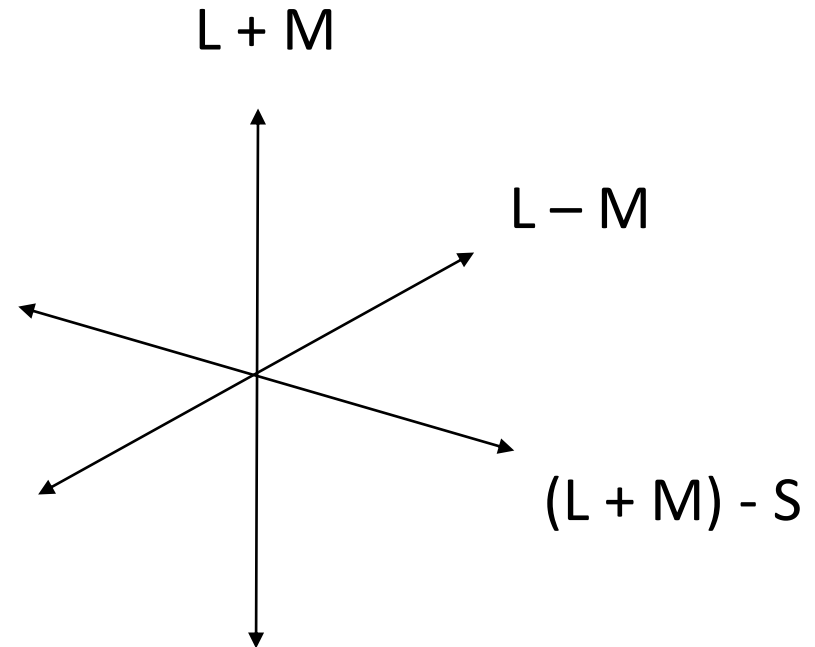
Retinal ganglion cells



# “Color Opponency” (Hering, 19<sup>th</sup> century)



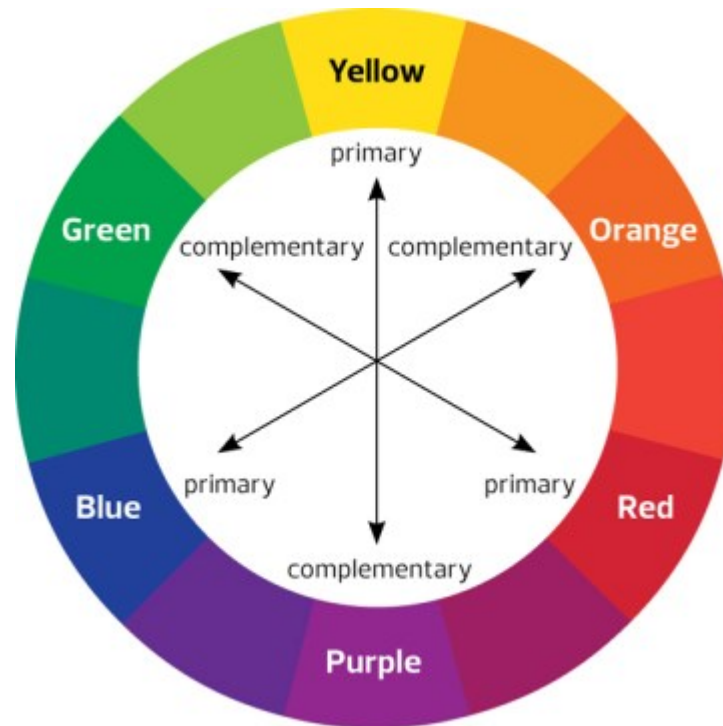
# Neural Mechanism (modern theory)



Orange is reddish-yellow. Purple is blueish-red. Cyan is greenish-blue.

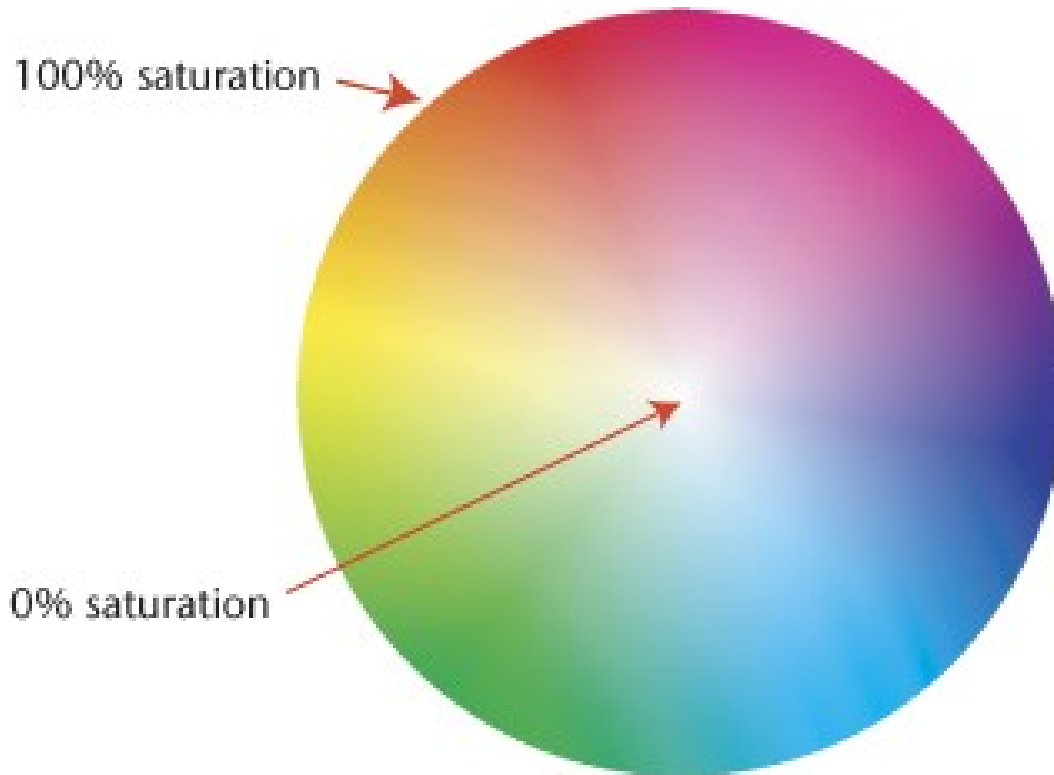
*Colors cannot appear reddish-green, blueish-yellow, blackish-white.*

# ASIDE: Classical Color Wheel



*Art class* ROYGBV theory of primary, secondary, and complementary colors is based on mixing pigments, not mixing lights.

# Polar coordinates for color



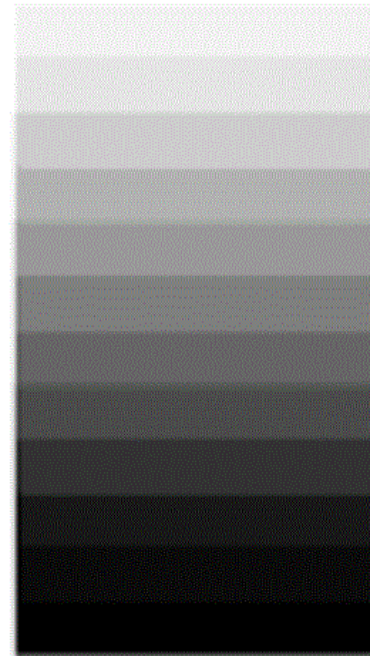
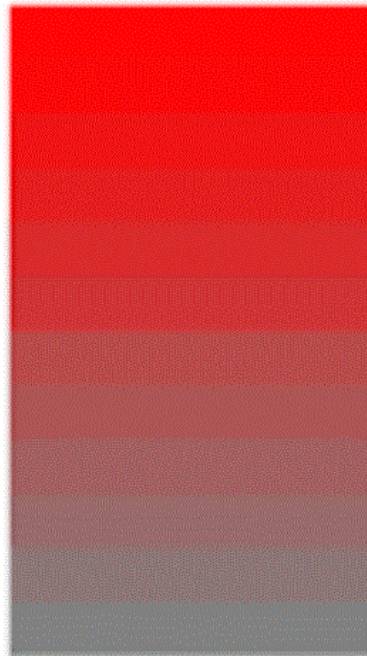
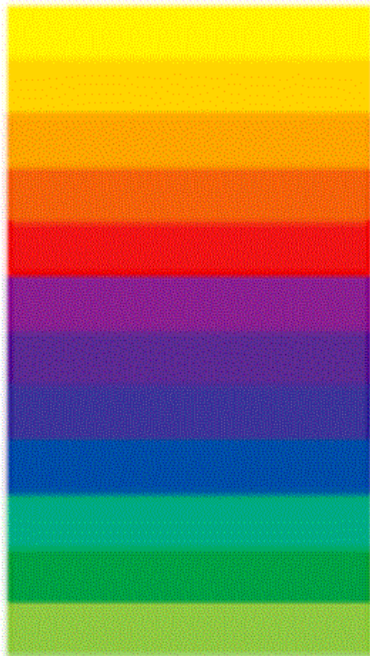
angle = "hue"  
radius = "saturation"

HUE

SATURATION

VALUE

(for HSV)

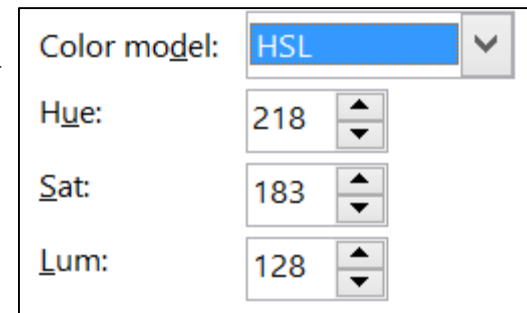
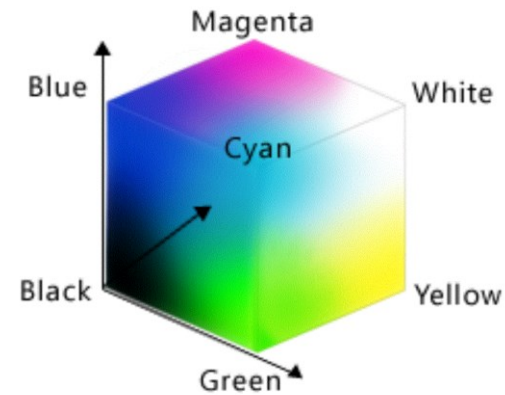
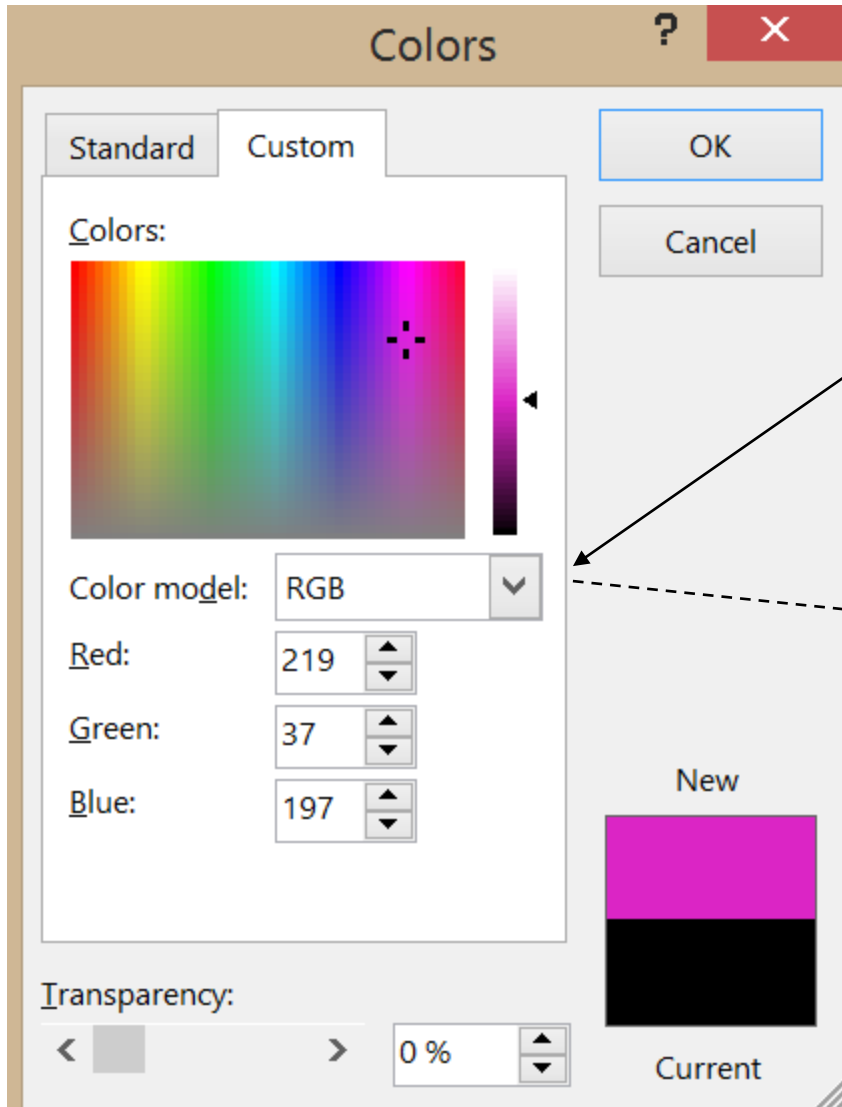


'color' name

purity

intensity

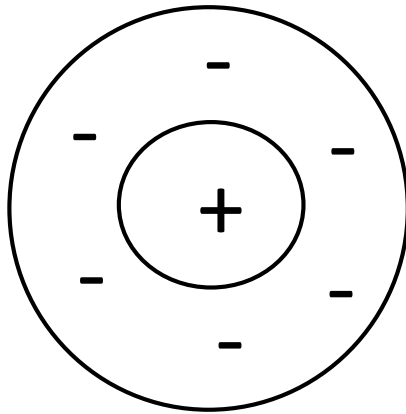
# RGB and HSL (similar to HSV)



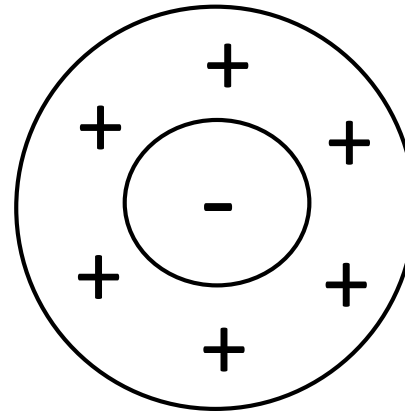
# Retinal ganglion cells encode image *differences* :

- spectral (wavelength  $\lambda$ ) , “chromatic”
- spatial (x,y)
- temporal (t)
- spectral-spatio-temporal ( $\lambda, x, y, t$ )

# Spatial differences: “center-surround receptive fields”



ON center,  
OFF surround

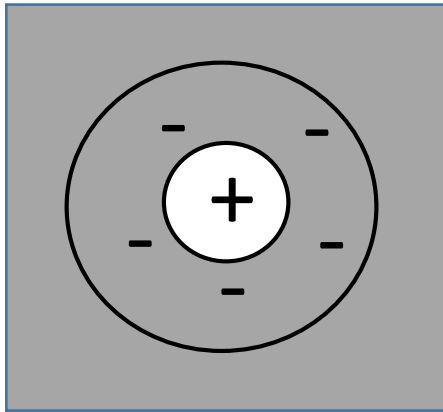


OFF center,  
ON surround

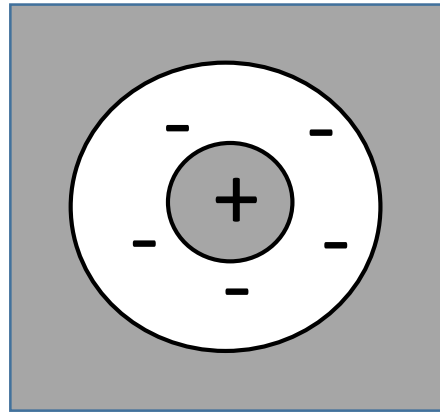
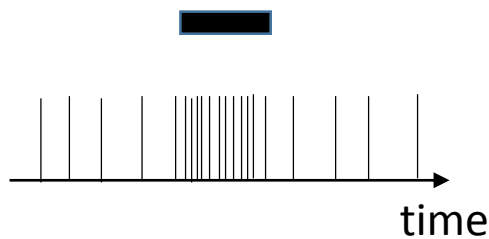
+ and - indicate where the cell is excited or inhibited (*depolarized* or *polarized*) by bright image spot in its receptive field.

# e.g. Retinal ganglion cells

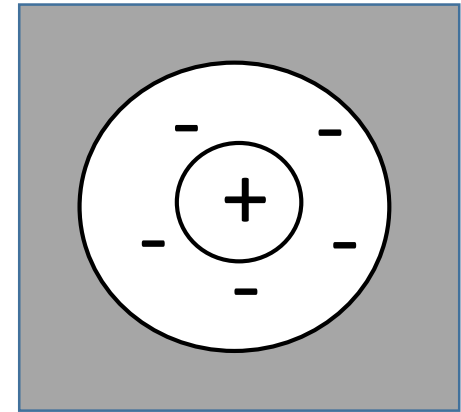
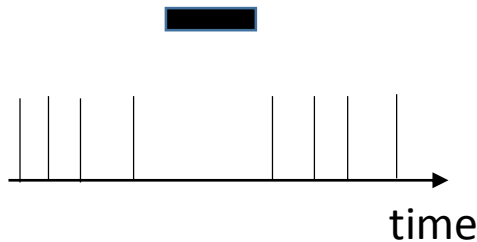
(first experiments on cats done in 1953)



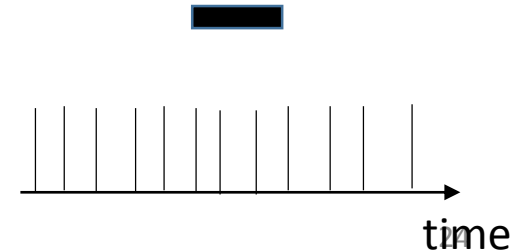
Shine light only  
in center.  
(ON center)



Shine light only  
in surround.  
(OFF surround)

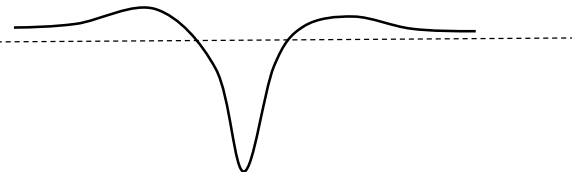
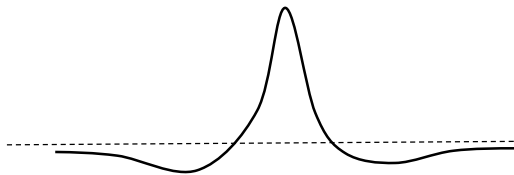
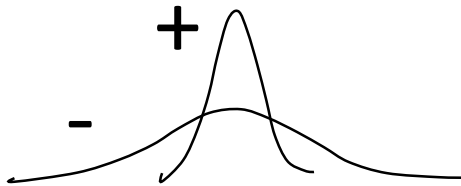
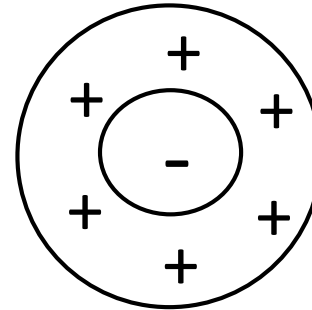
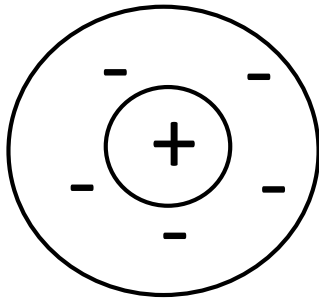


Shine light in center  
and surround.





# Proposed Mechanism (Rodieck, 1965)



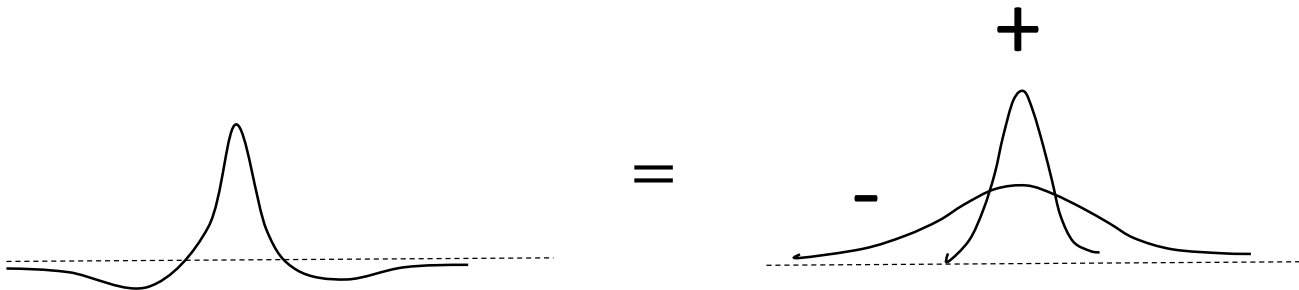
# Gaussian model



$$G(x) = \frac{1}{\sqrt{2\pi} \sigma} e^{-\frac{x^2}{2\sigma^2}}$$

# Difference of Gaussians (DOG) model

$$DOG(x, \sigma_1, \sigma_2) = \frac{1}{\sqrt{2\pi}\sigma_1} e^{-\frac{x^2}{2\sigma_1^2}} - \frac{1}{\sqrt{2\pi}\sigma_2} e^{-\frac{x^2}{2\sigma_2^2}}$$



## 2D Gaussian and 2D DOG

$$G(x, y, \sigma) \equiv G(x, \sigma) G(y, \sigma)$$

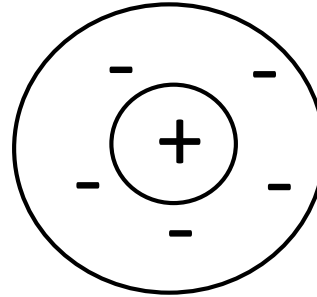
$$= \frac{1}{\sqrt{2\pi}\sigma} e^{-\frac{x^2}{2\sigma^2}} * \frac{1}{\sqrt{2\pi}\sigma} e^{-\frac{y^2}{2\sigma^2}}$$

$$= \frac{1}{2\pi\sigma^2} e^{-\frac{x^2+y^2}{2\sigma^2}}$$

$$DOG(x, y, \sigma_1, \sigma_2) = G(x, y, \sigma_1) - G(x, y, \sigma_2)$$

# Response of a cell (DOG)

DOG cell centered at  $(x_0, y_0)$



Response depends on:

$$L = \iint I(x, y) \text{DOG}(x - x_0, y - y_0, \sigma_1, \sigma_2) dx dy$$

*Here I am ignoring temporal properties for simplicity.*

# Linear response model

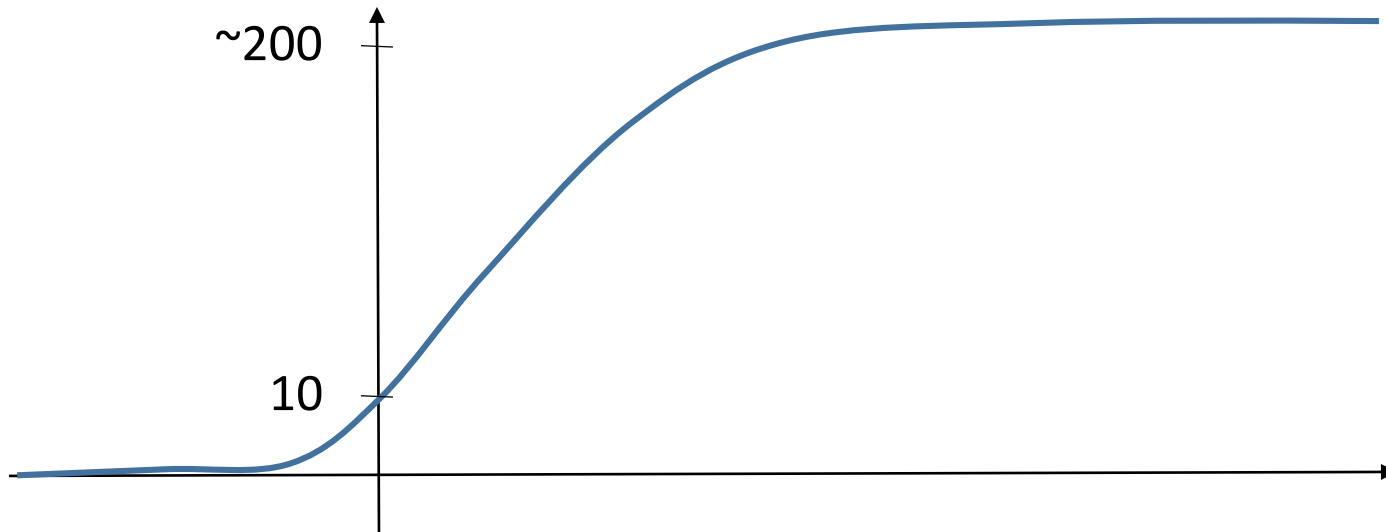
$$L = \iint DOG(x - x_0, y - y_0, \sigma_1, \sigma_2) I(x, y) dx dy$$

Alternatively we can write it as a sum:

$$L = \sum_{x,y} DOG(x - x_0, y - y_0, \sigma_1, \sigma_2) I(x, y)$$

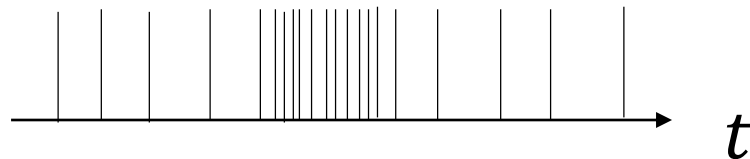
# “Static Non-linearity”

Spike firing rate  
(spikes per second)

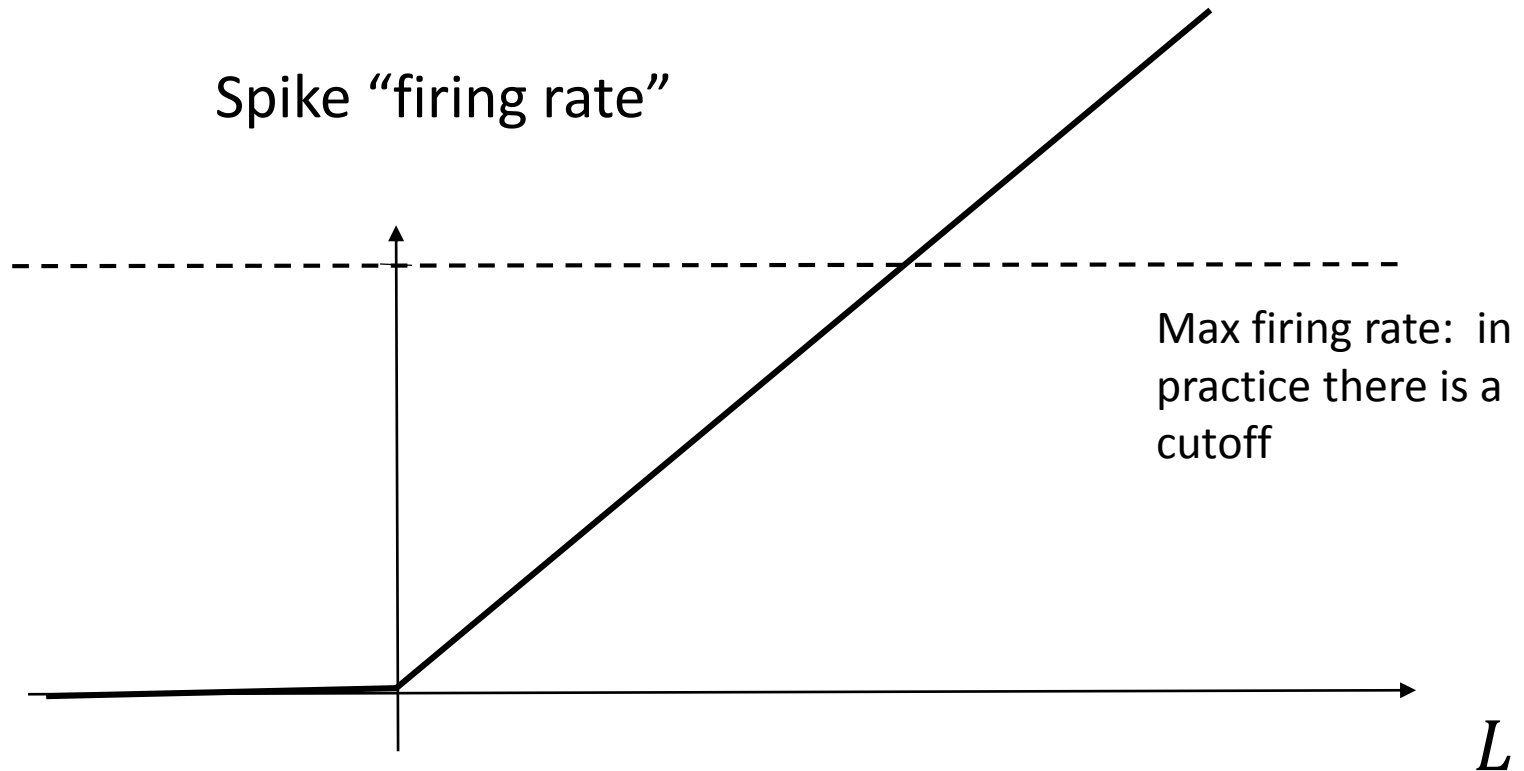


$L$

Spike train



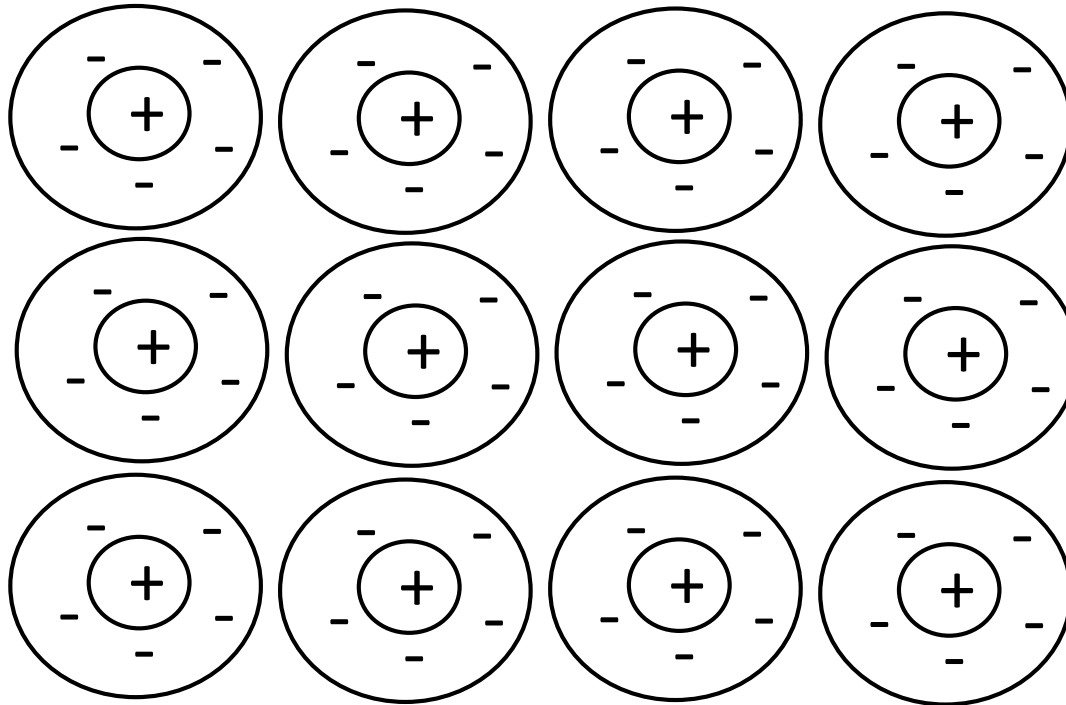
# Half-wave rectification model



$$L = \max\left(0, \sum_{x,y} \text{DOG}(x - x_0, y - y_0, \sigma_1, \sigma_2) I(x, y)\right)$$

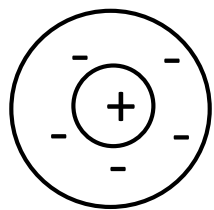


# Responses of a *population* of DOGs

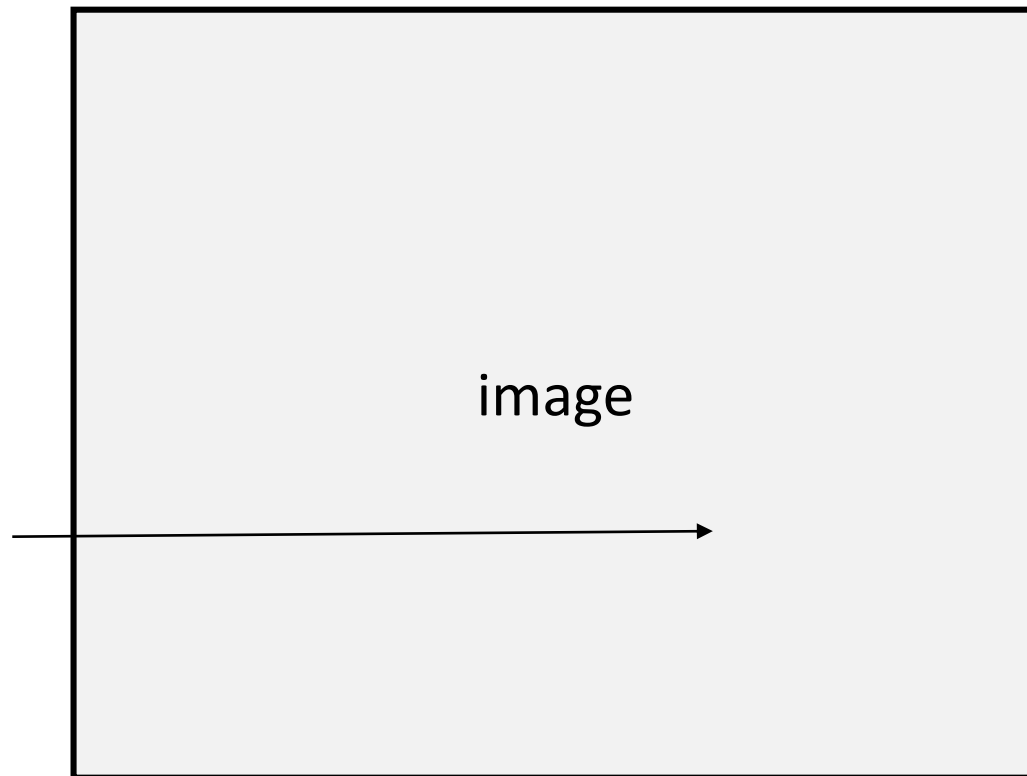


... and many *overlapping ones* which I am not showing because it would be too messy

# “Cross correlation”



DOG



# Responses of a *population* of DOGs

Cross correlation operator



$$L(x_0, y_0) \equiv DOG(x, y, \sigma_1, \sigma_2) \otimes I(x, y)$$

$$\equiv \sum_{x, y} DOG(x, y) I(x_0 + x, y_0 + y)$$



change of variables

$$\equiv \sum_{u, v} DOG(u - x_0, v - y_0) I(u, v)$$

# Cross correlation

$$f(x, y) \otimes I(x, y) \equiv \sum_{u, v} f(u - x, v - y) I(u, v)$$

Convolution (to be discussed later)

$$f(x, y) * I(x, y) \equiv \sum_{u, v} f(x - u, y - v) I(u, v)$$

# Technical detail (boundary effects)

