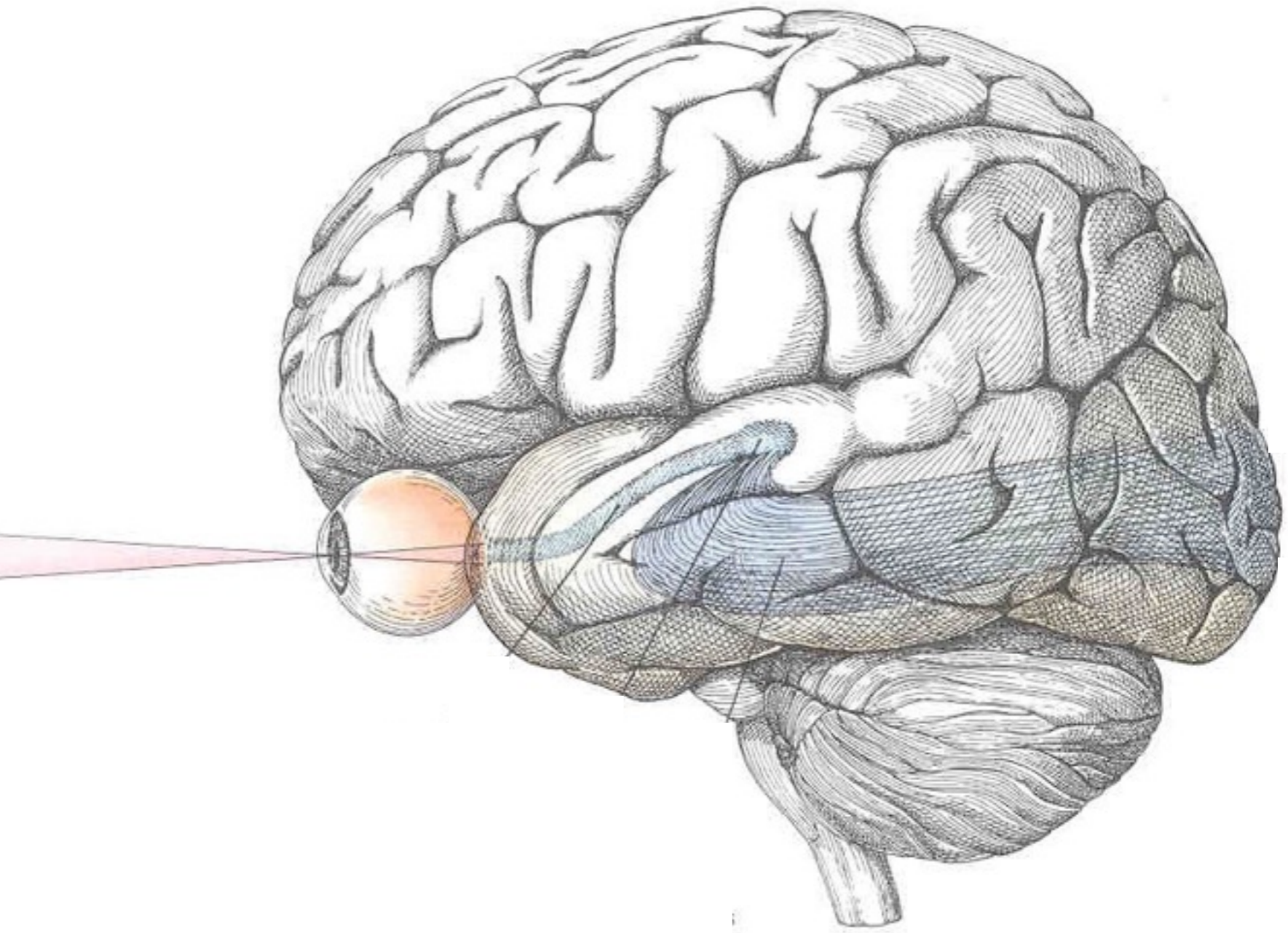


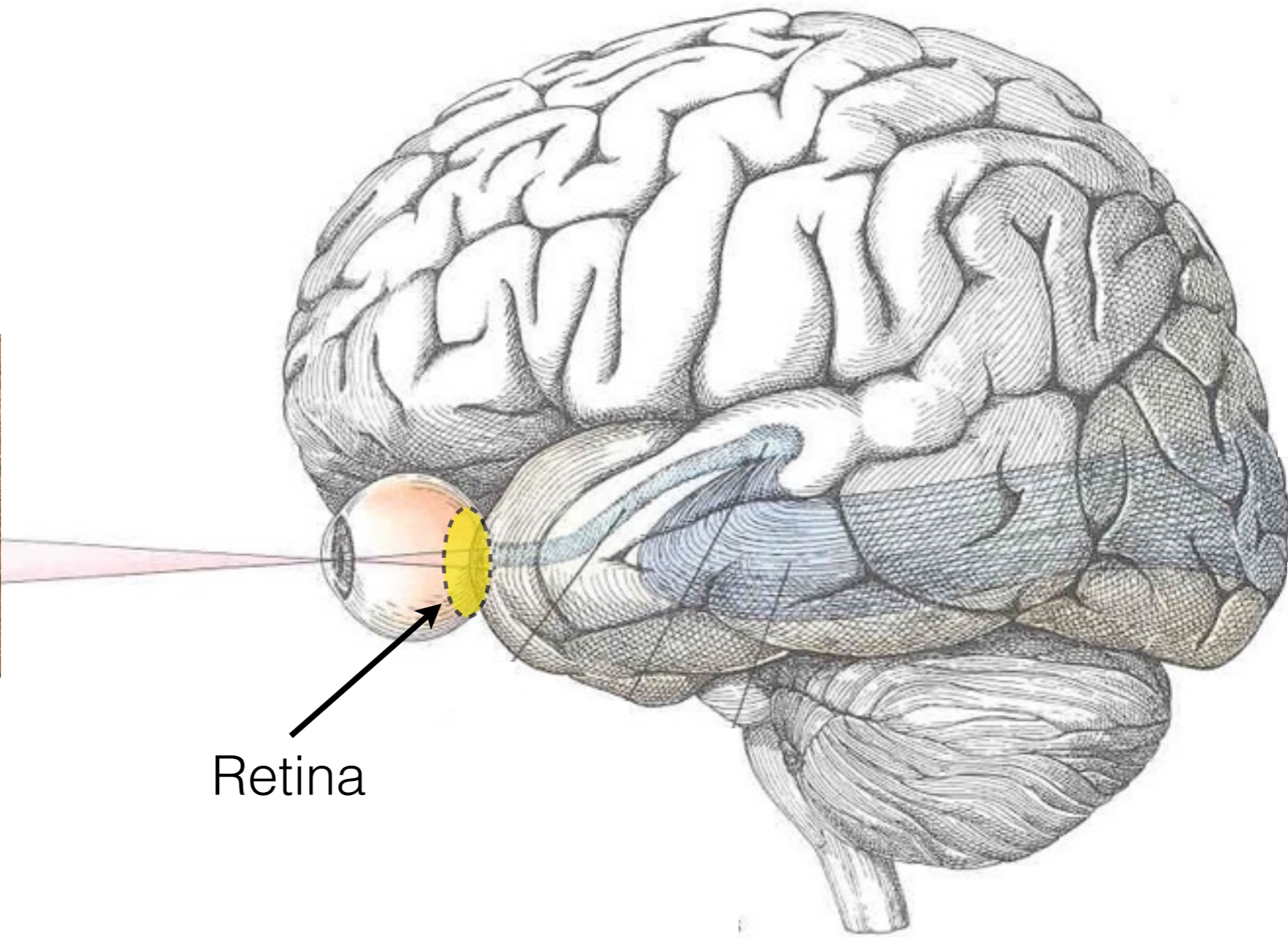
An introduction to the visual system

Benjamin Naecker
bnaecker@stanford.edu
23 June 2015

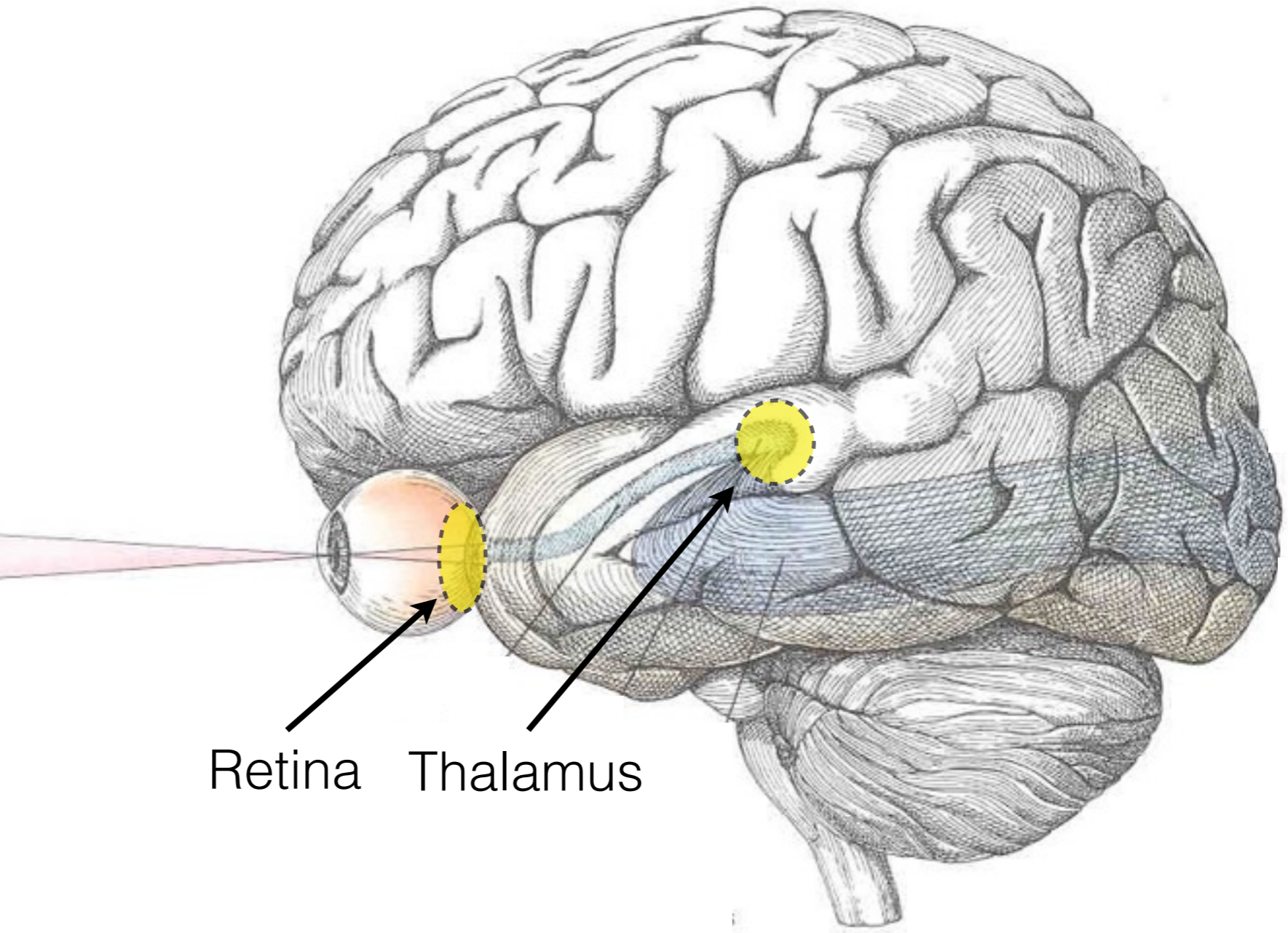




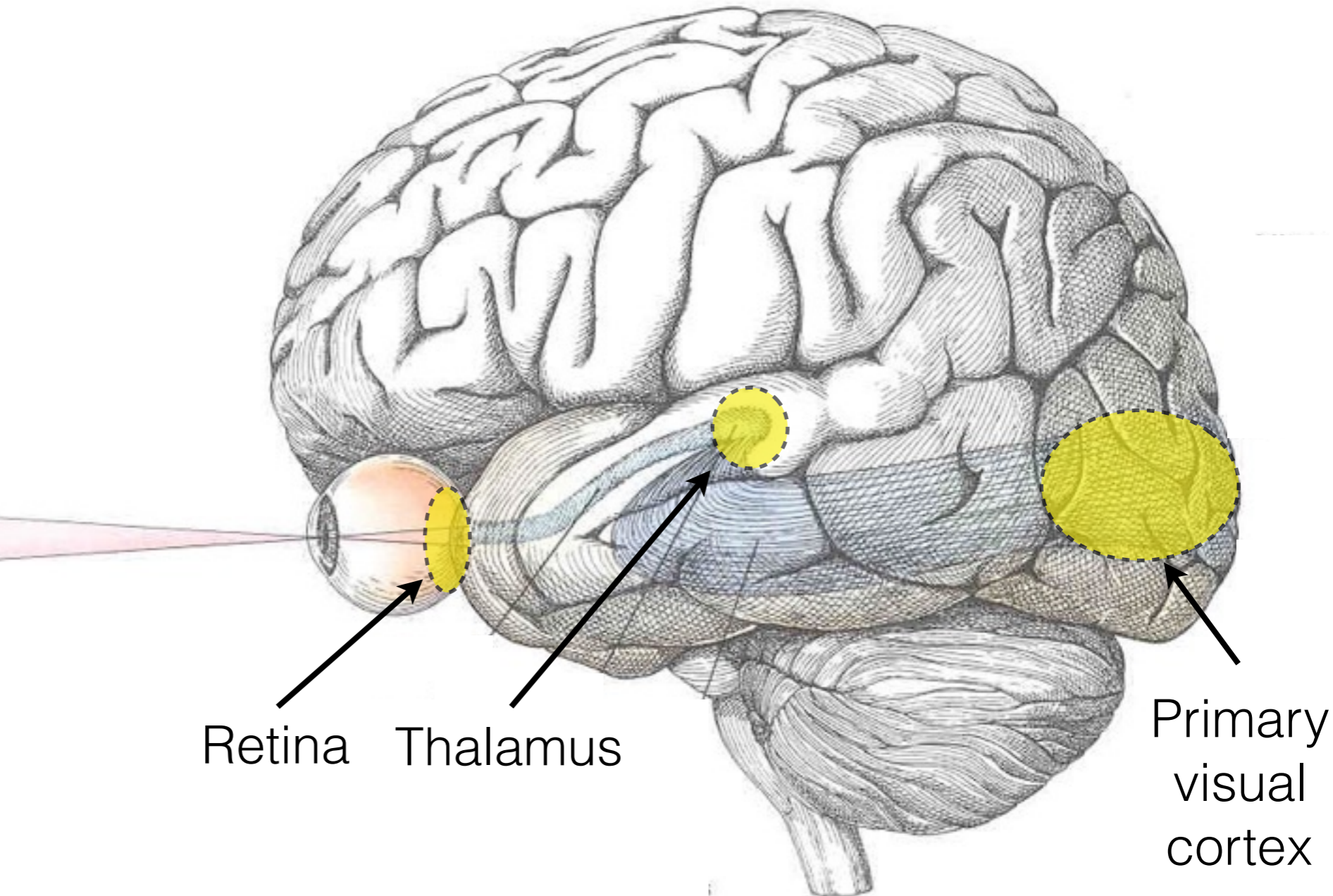




Retina

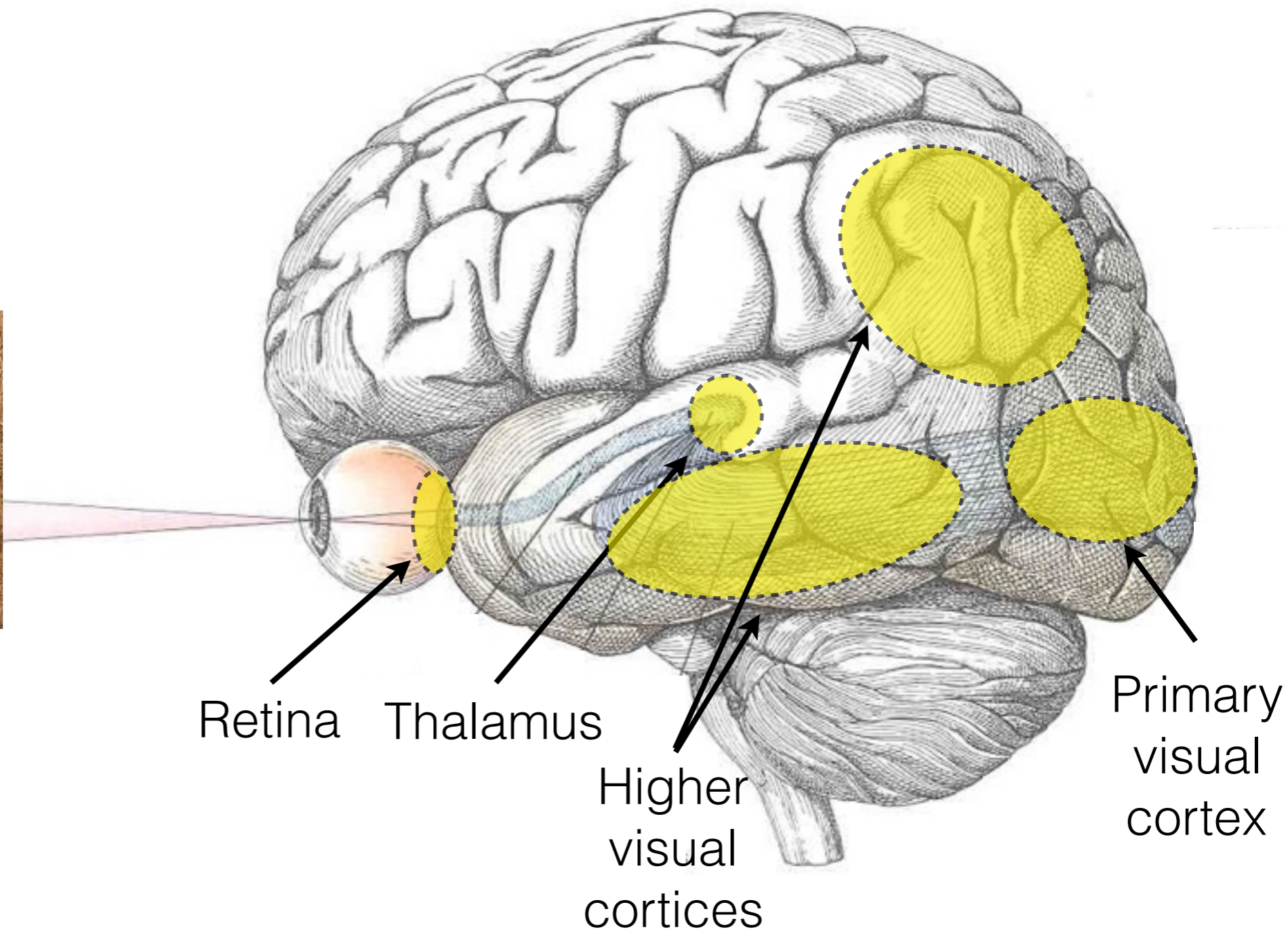


Retina Thalamus



Retina Thalamus

Primary visual cortex

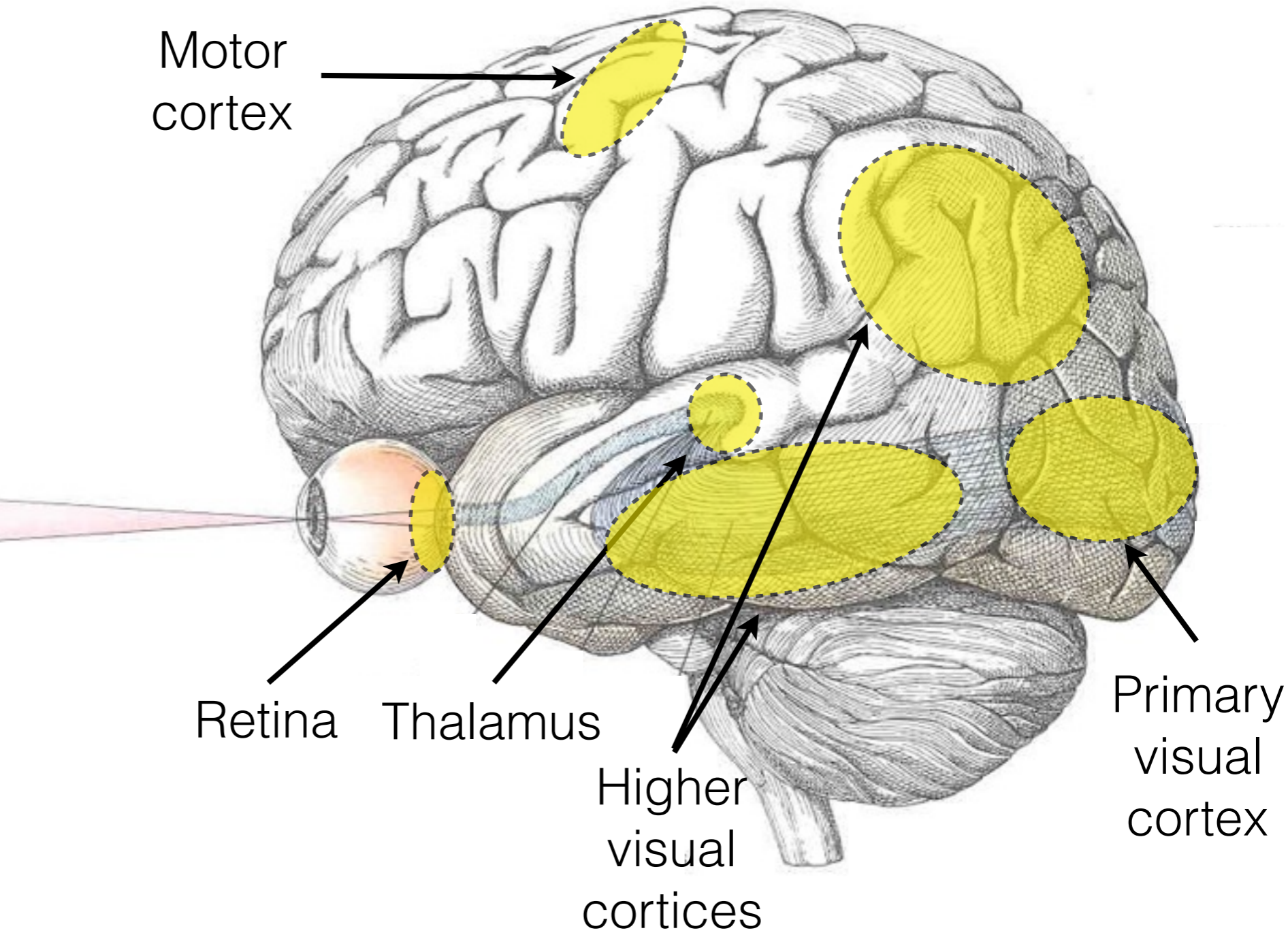


Retina

Thalamus

Higher
visual
cortices

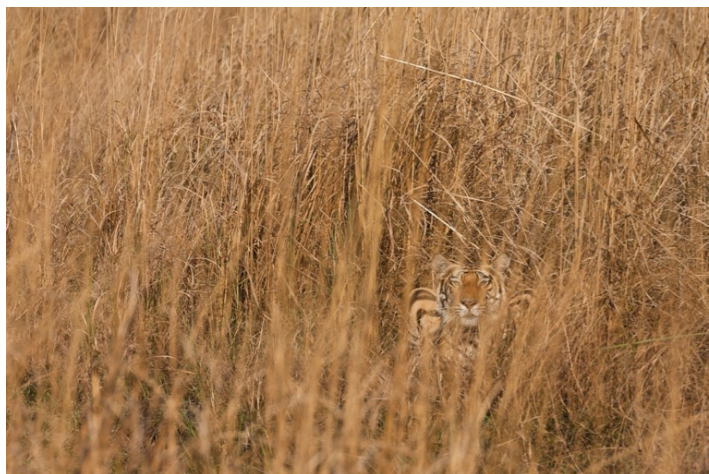
Primary
visual
cortex







Do a bunch
of stuff



Do a bunch
of stuff





Do a bunch
of stuff

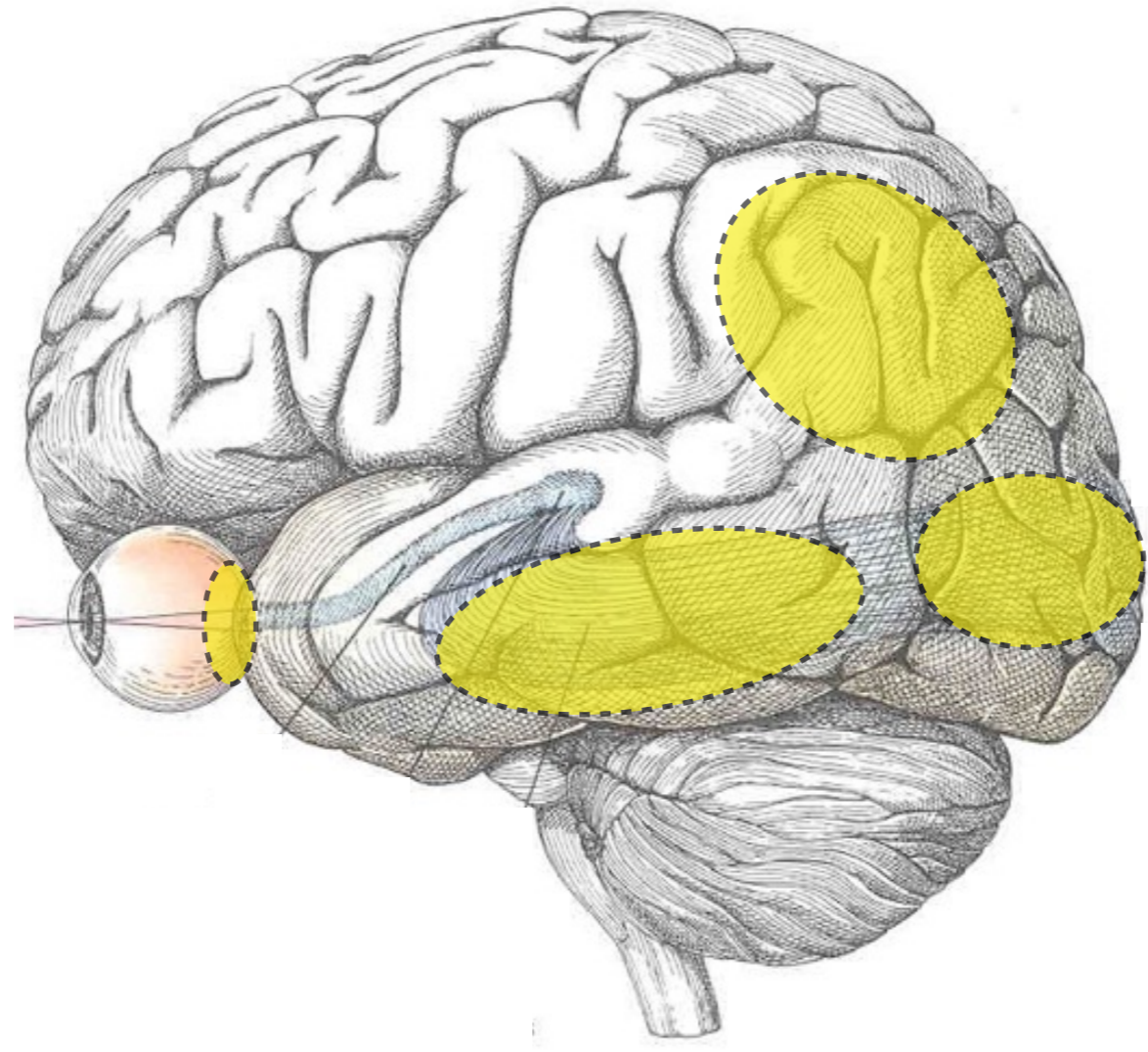


$\approx 1/2$ second

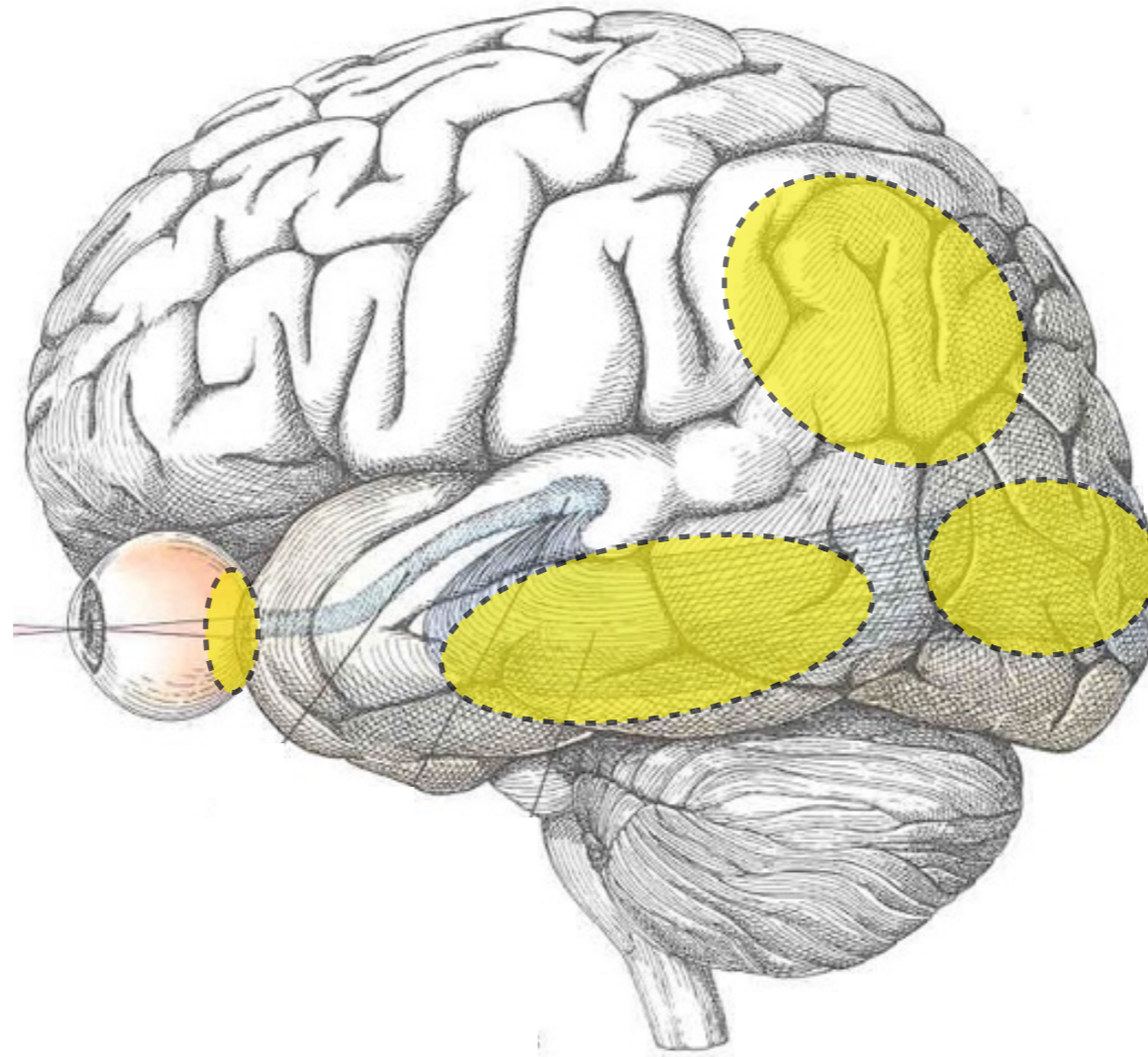
How does this happen?

An introduction to the visual system

An introduction to the visual system

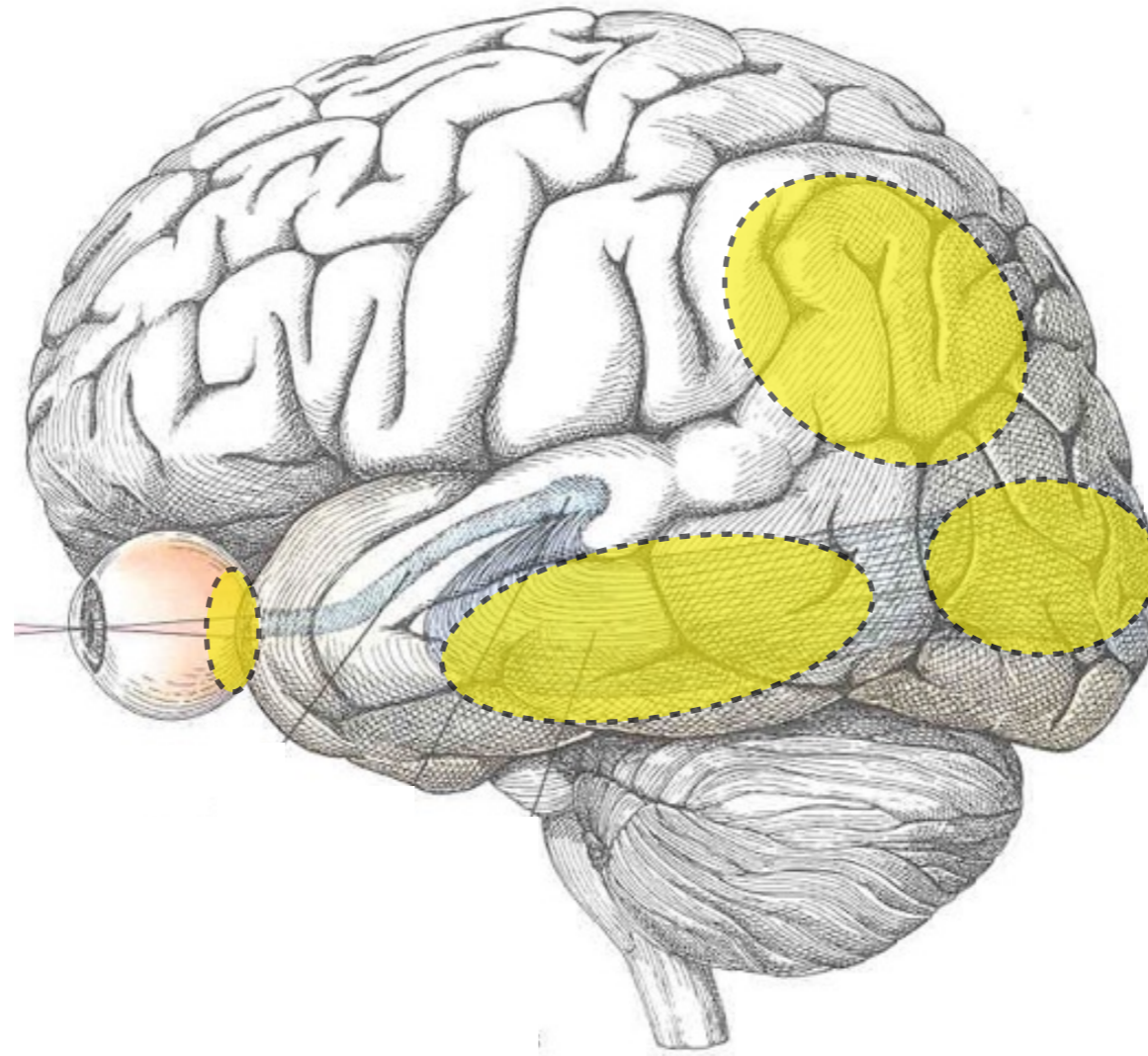


An introduction to the visual system



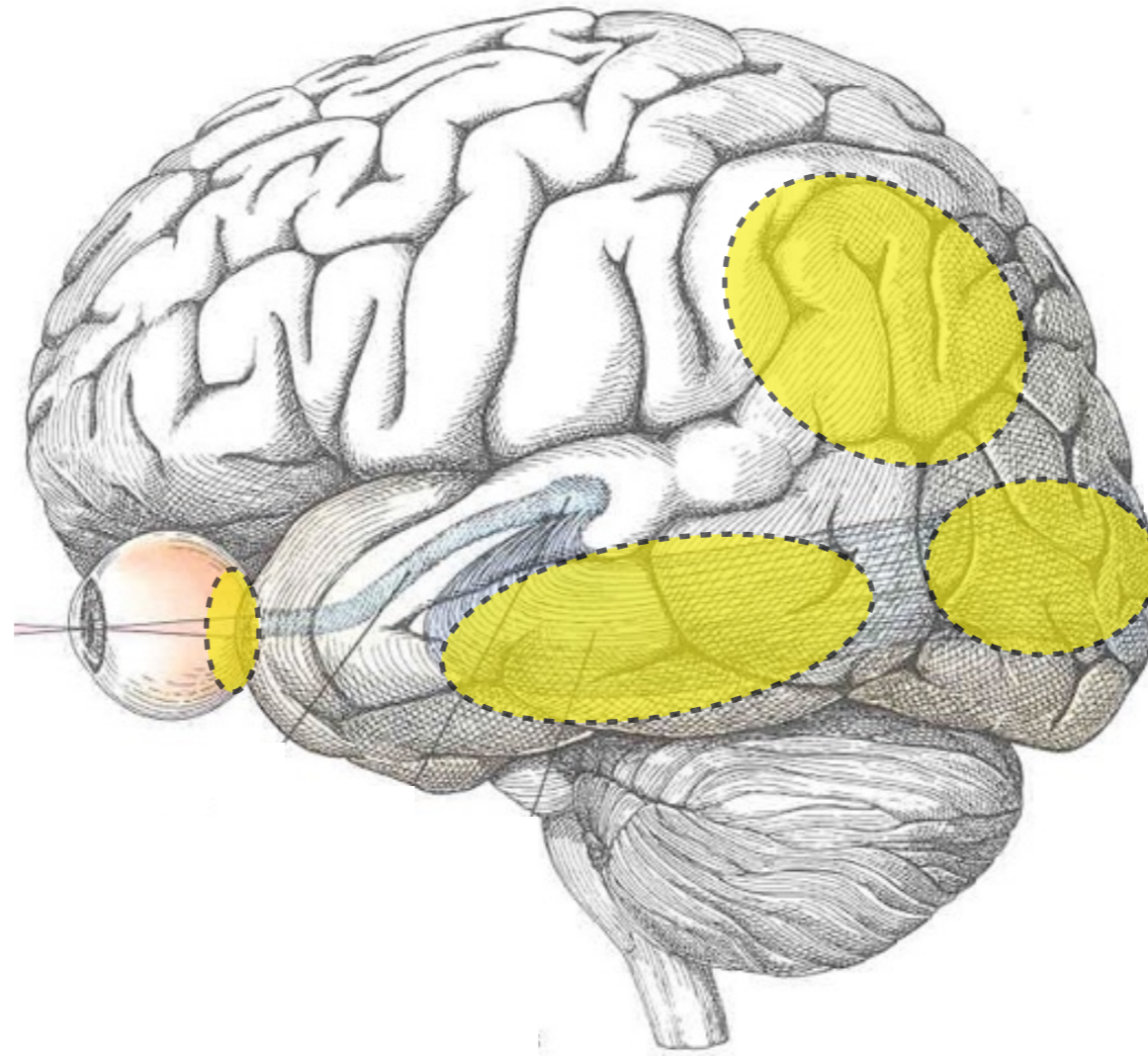
- The retina

An introduction to the visual system



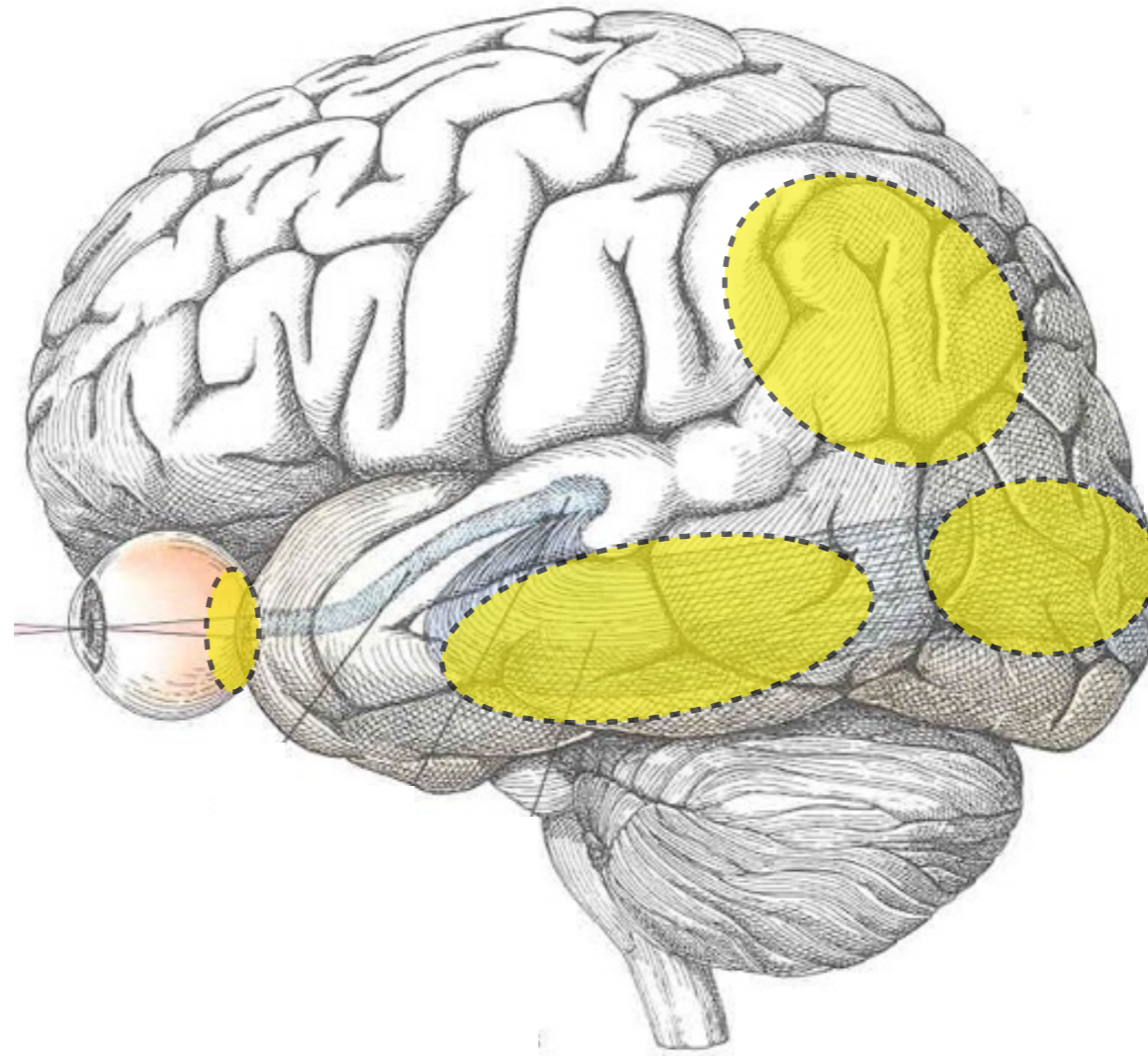
- The retina
- Primary visual cortex

An introduction to the visual system



- The retina
- Primary visual cortex
- Higher visual cortices

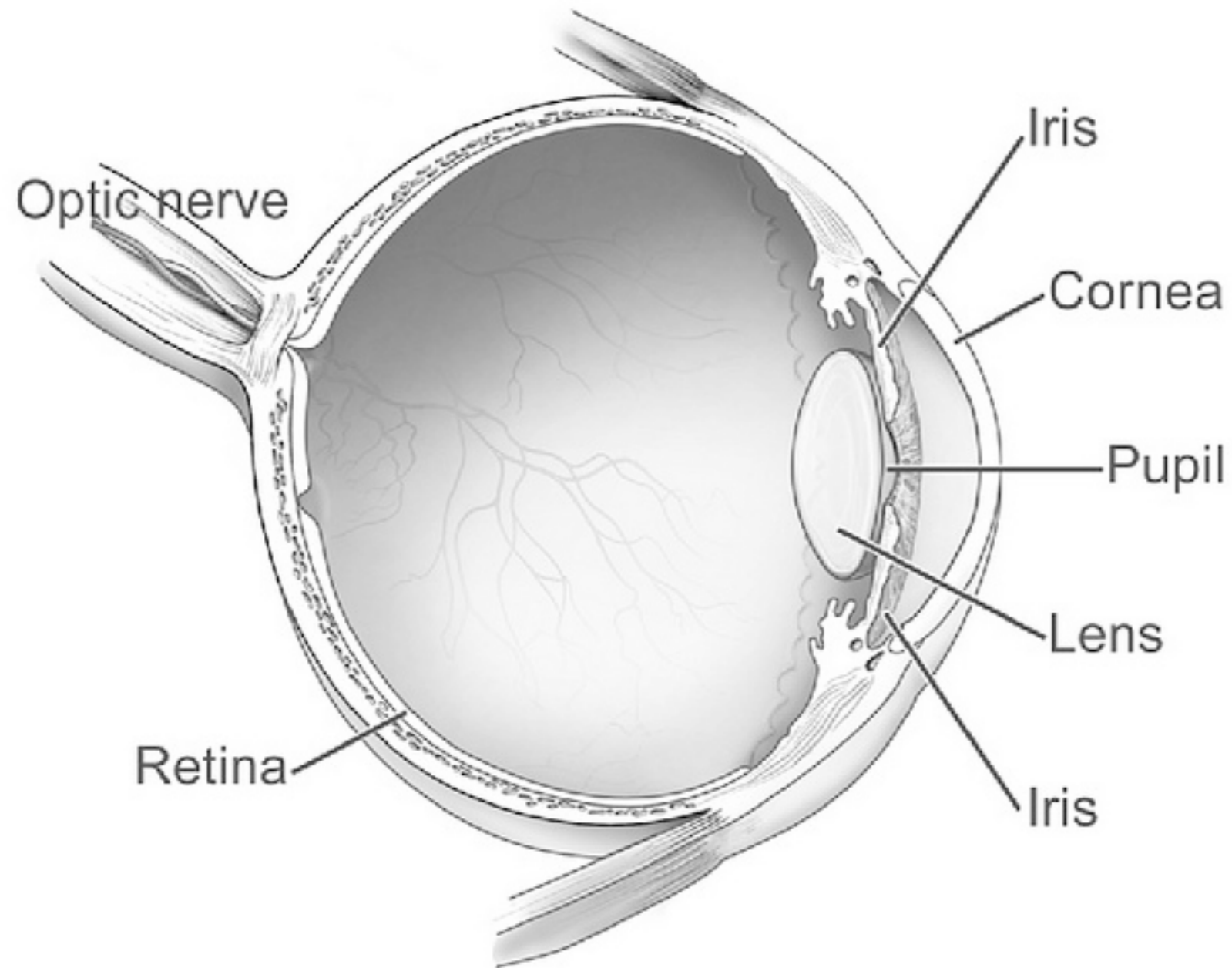
An introduction to the visual system



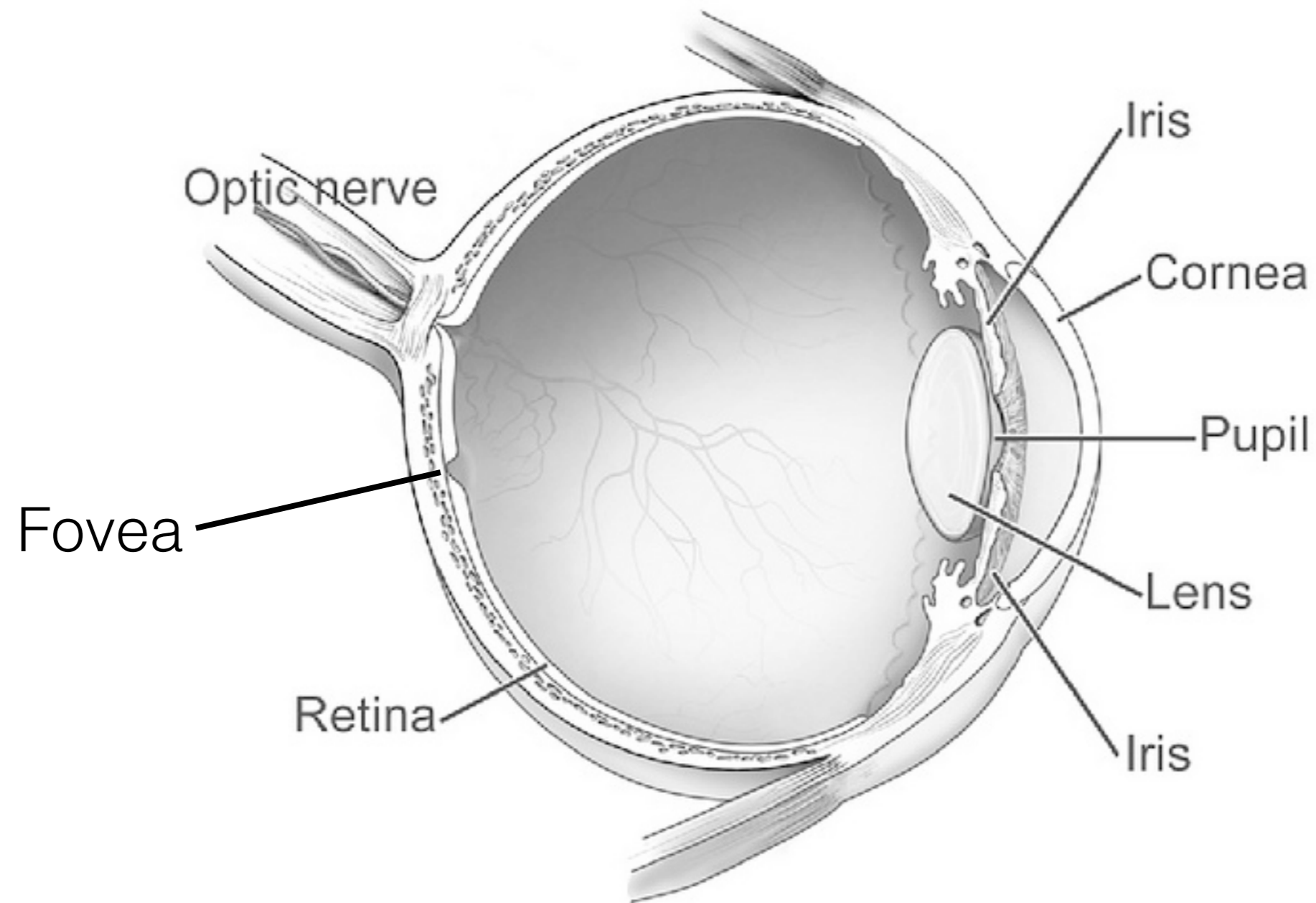
- The retina
- Primary visual cortex
- Higher visual cortices
- Current research in visual neuroscience

Eye and retina

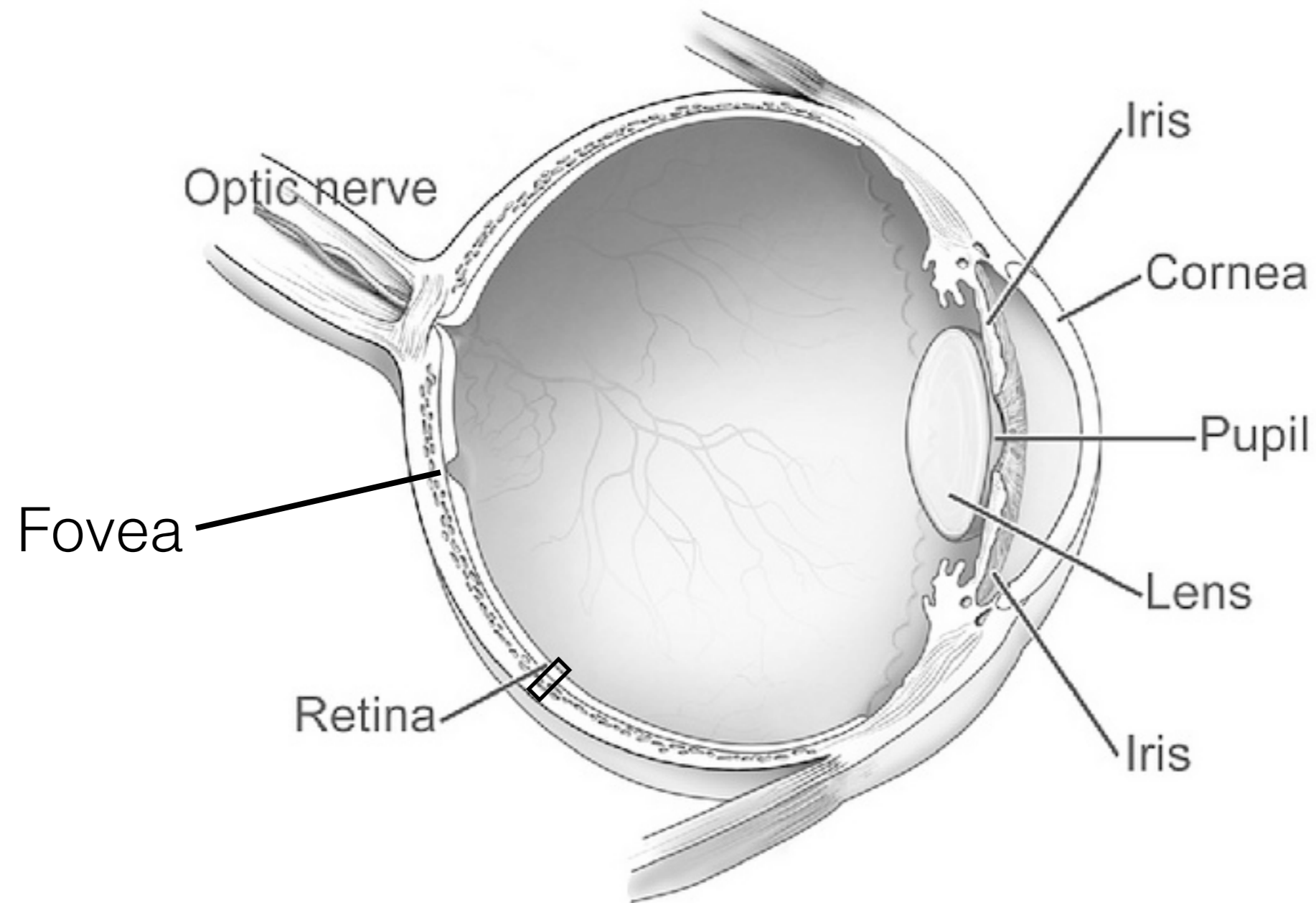
Eye and retina



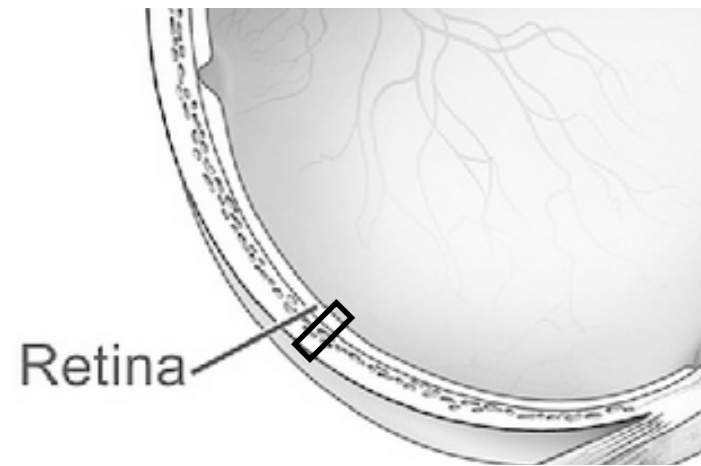
Eye and retina



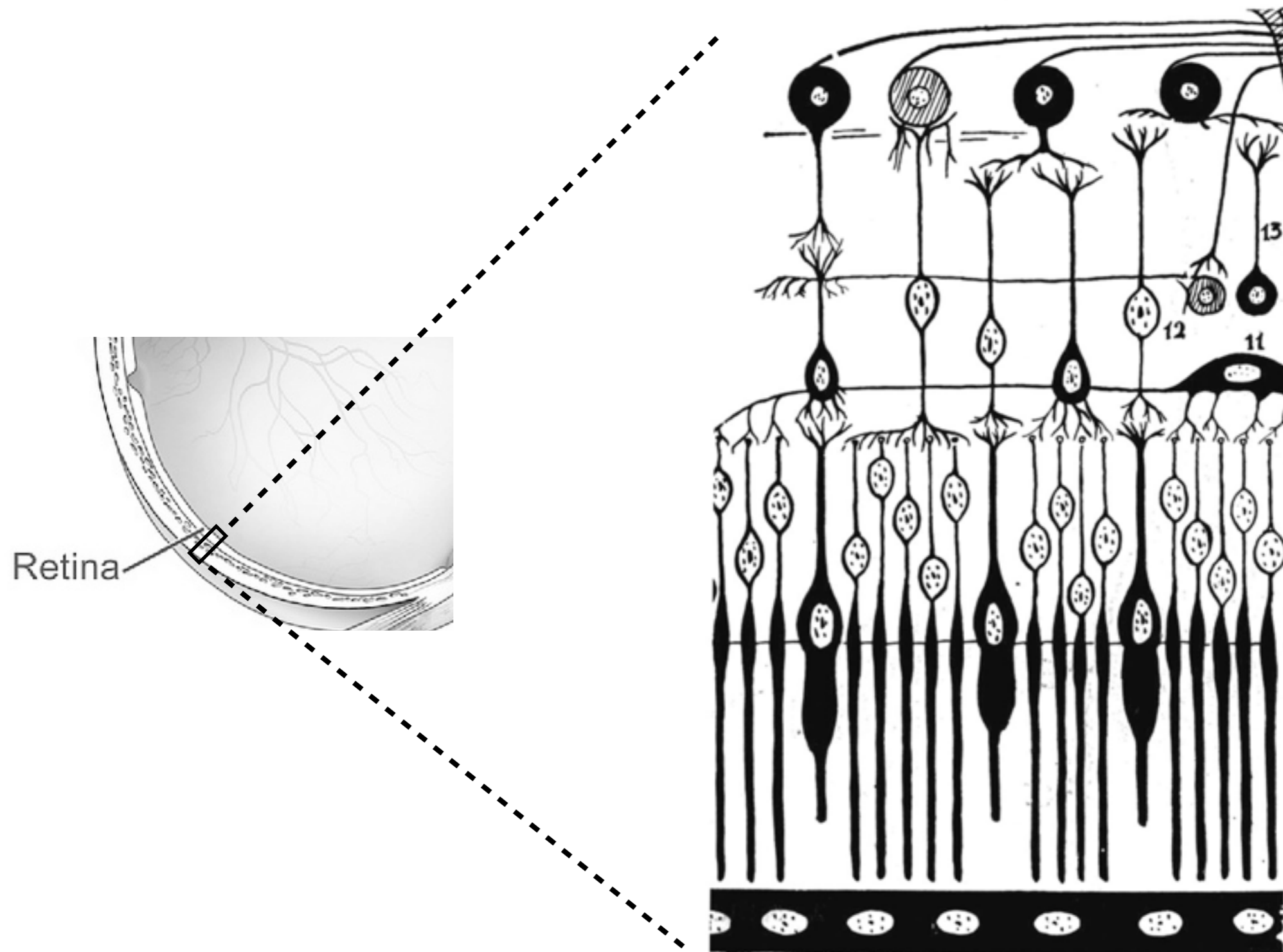
Eye and retina



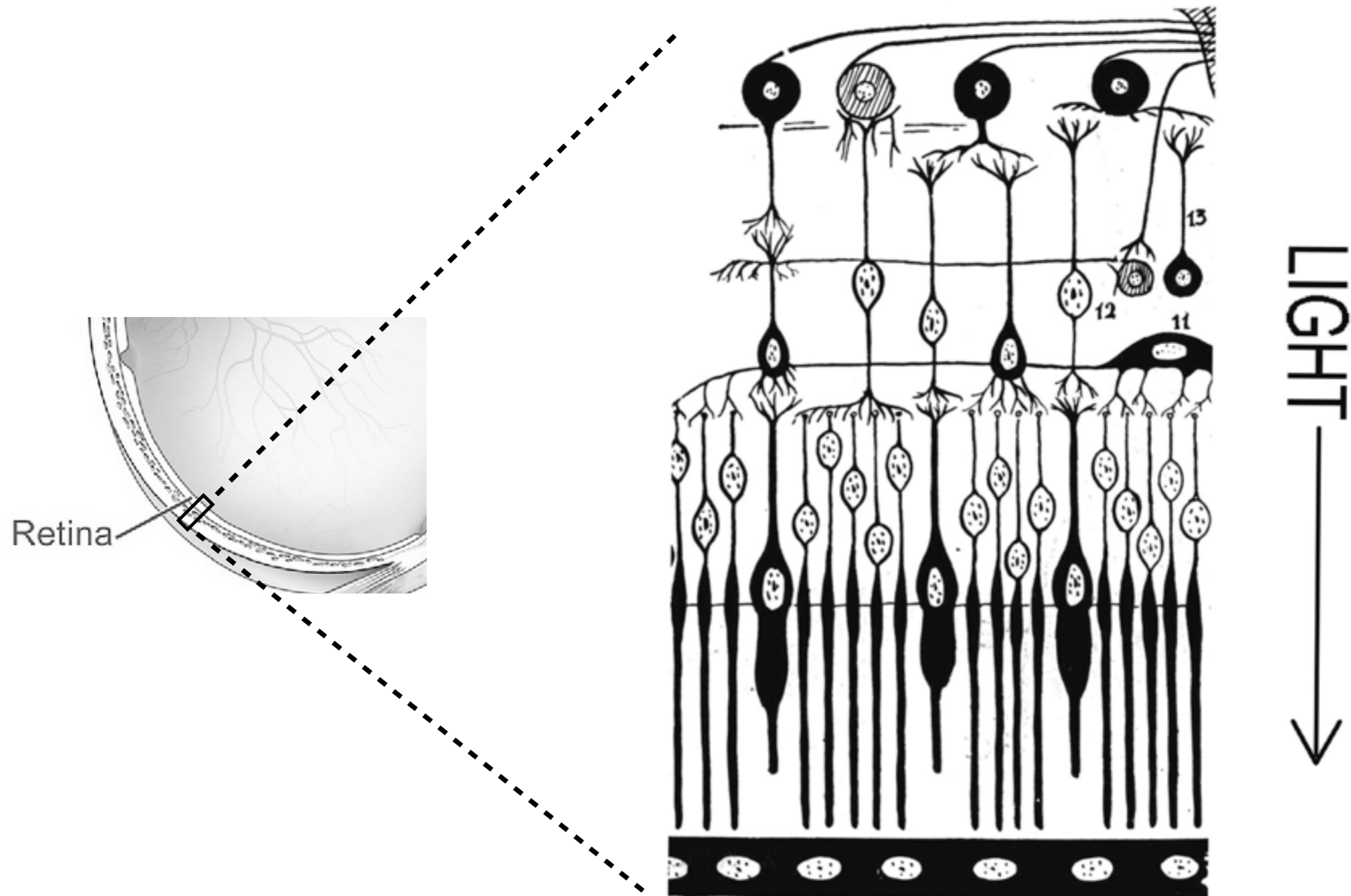
Eye and retina



Eye and retina

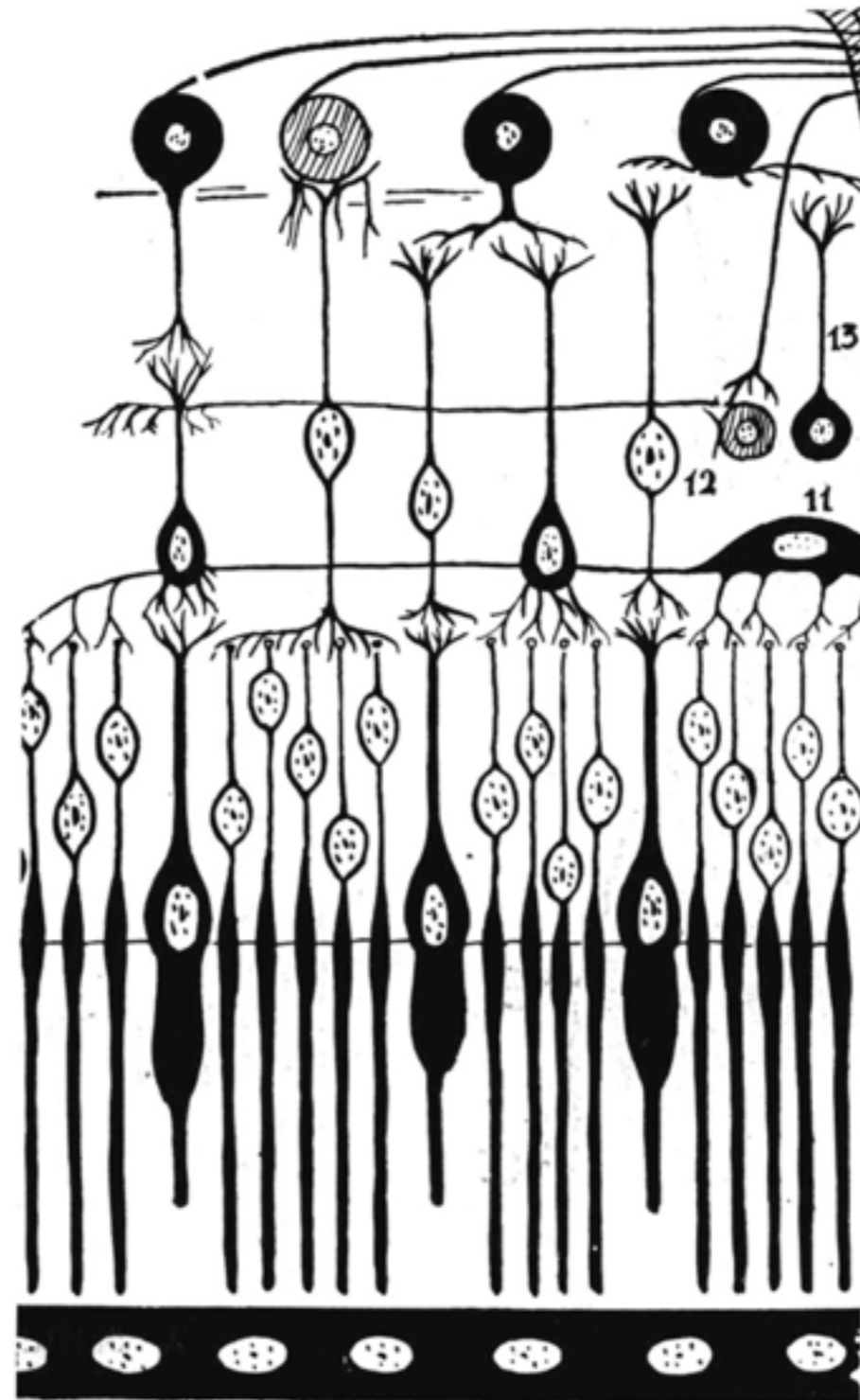


Eye and retina

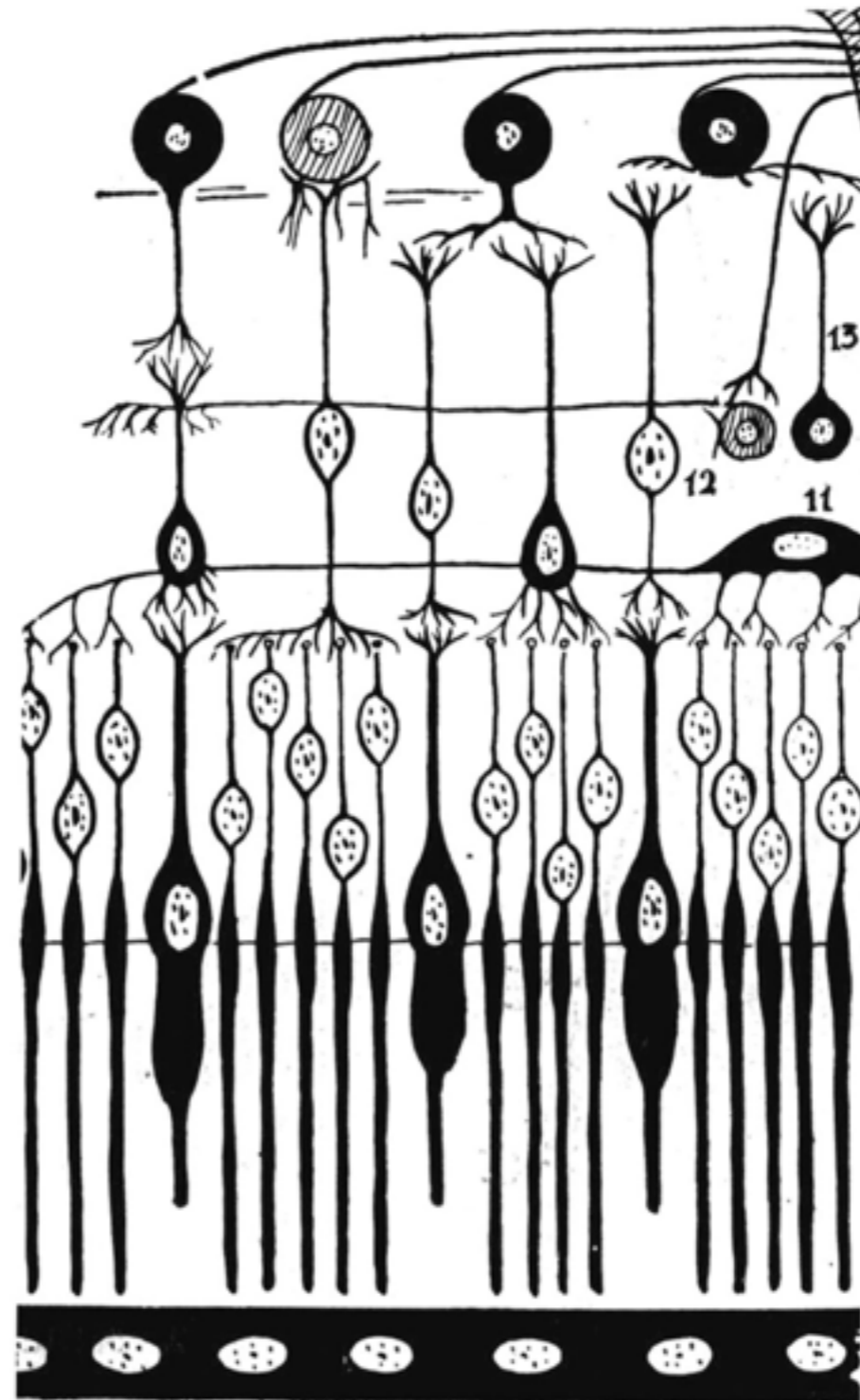


Eye and retina

Eye and retina



Eye and retina

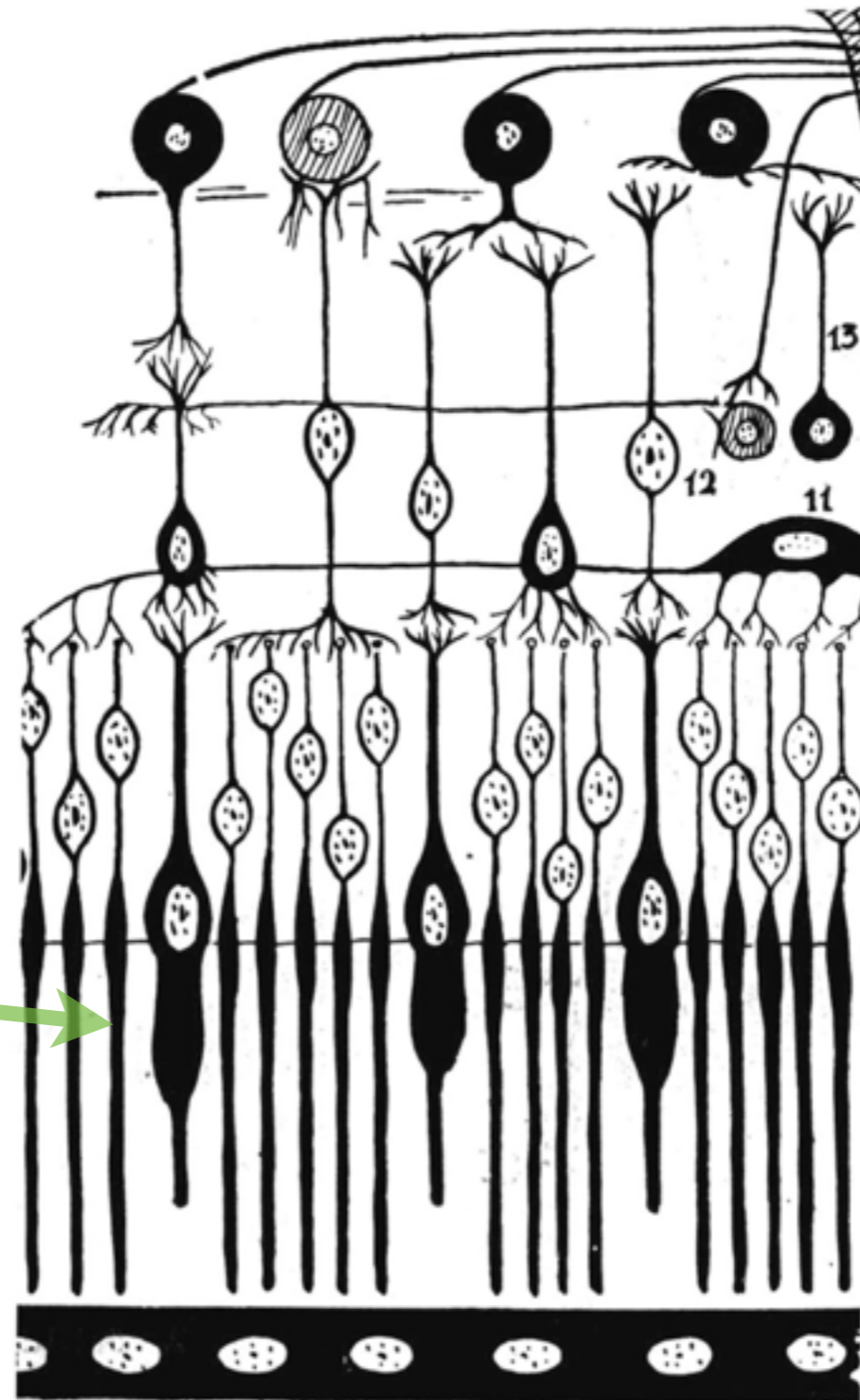


Outer nuclear
layer

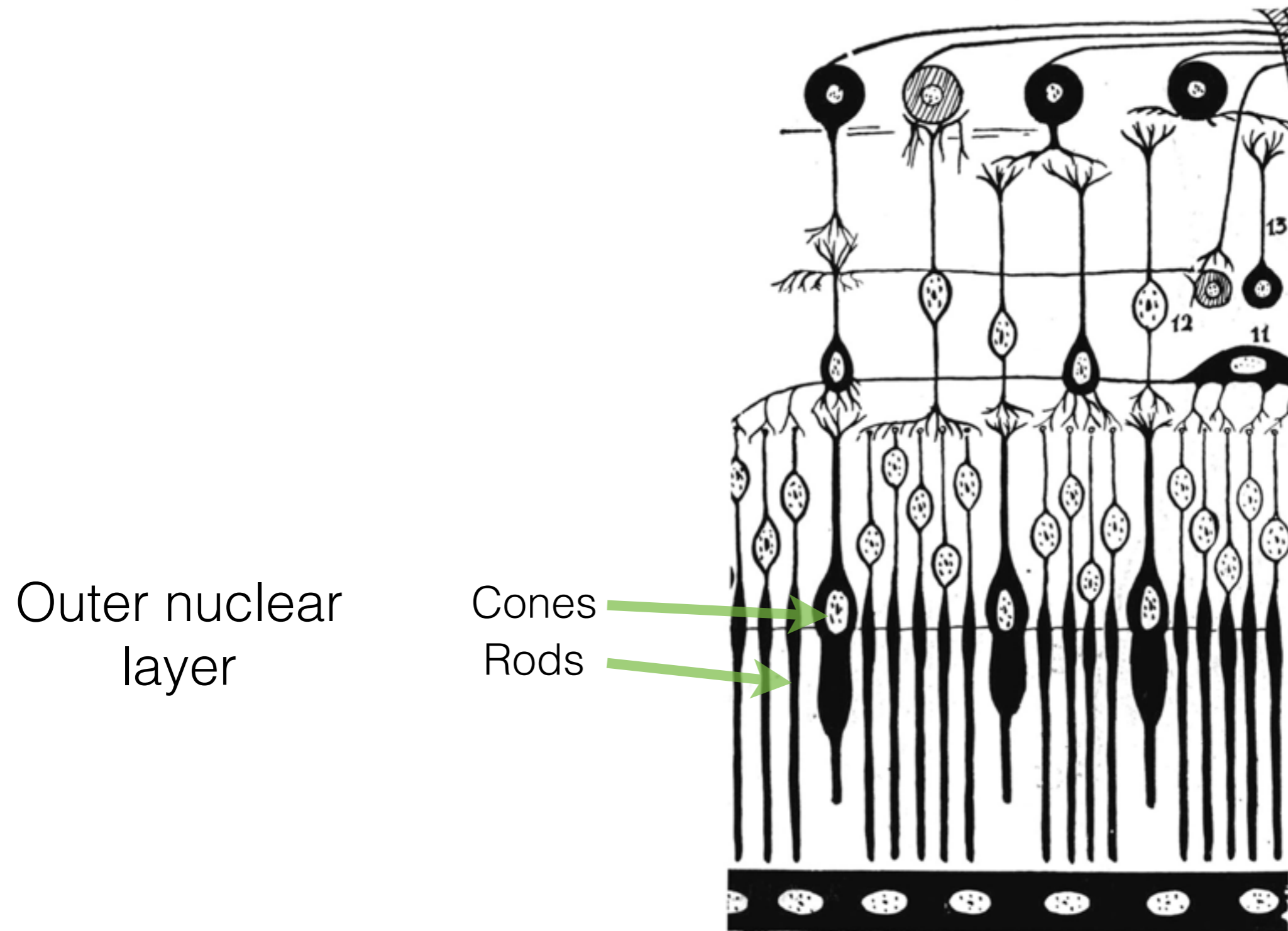
Eye and retina

Outer nuclear
layer

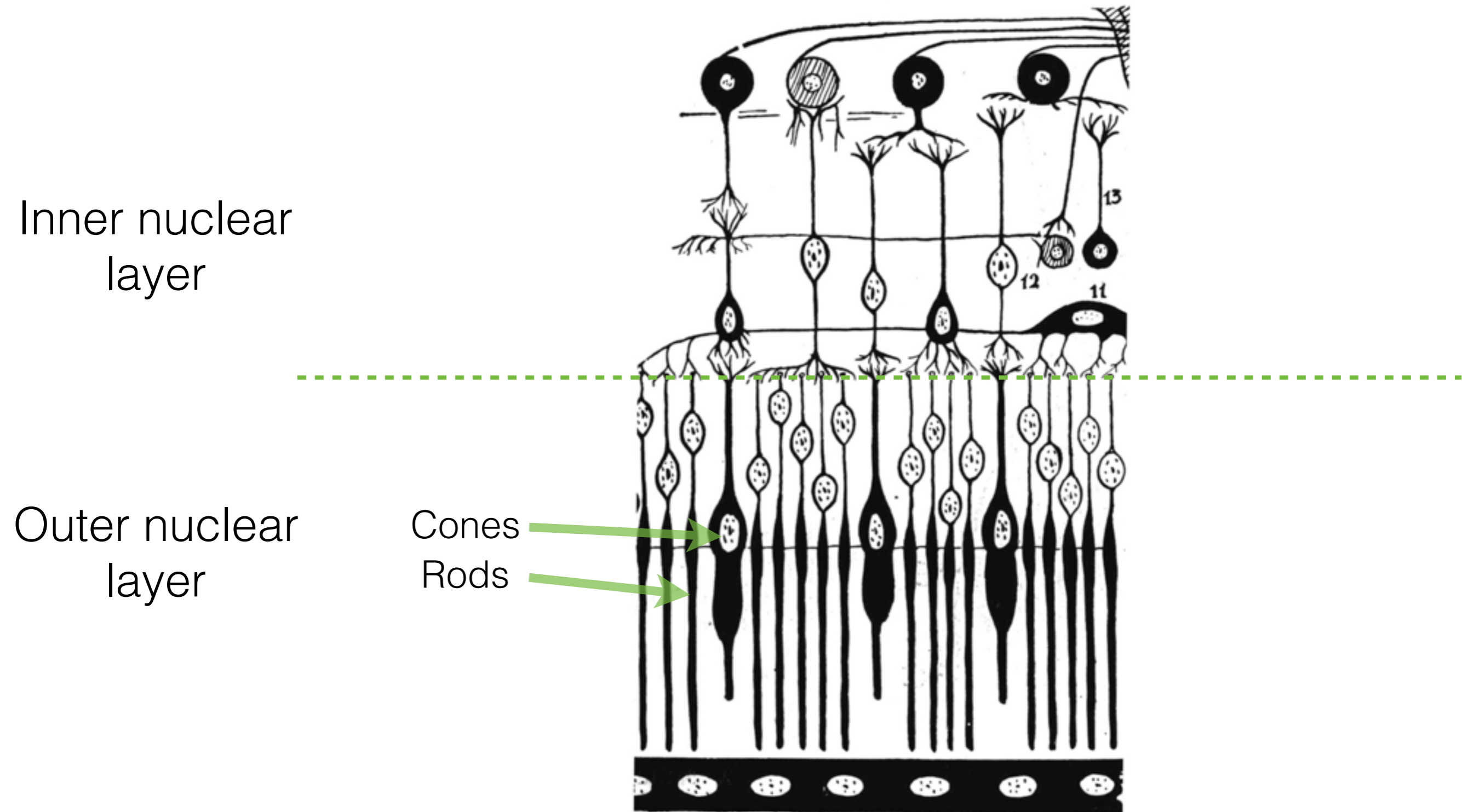
Rods



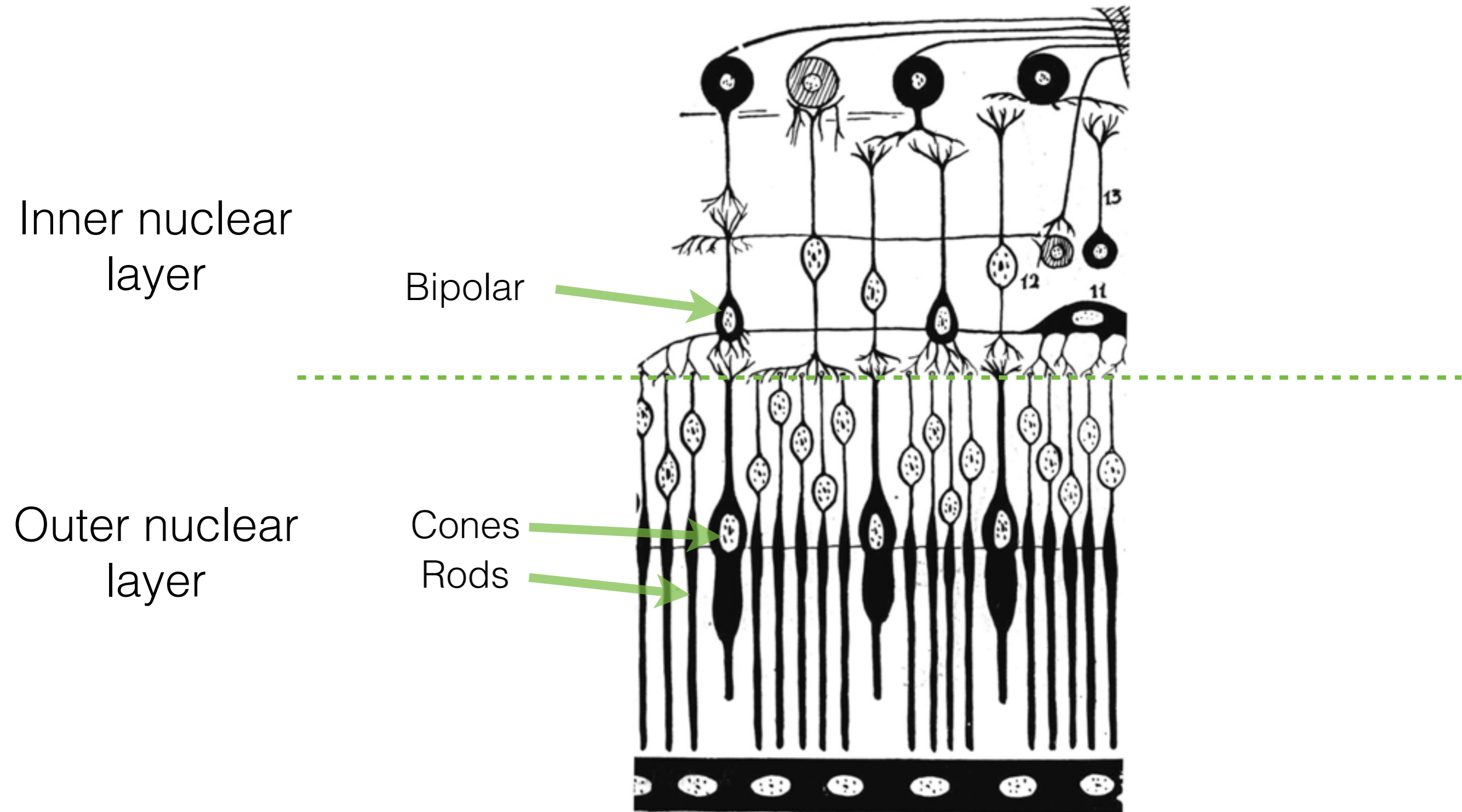
Eye and retina



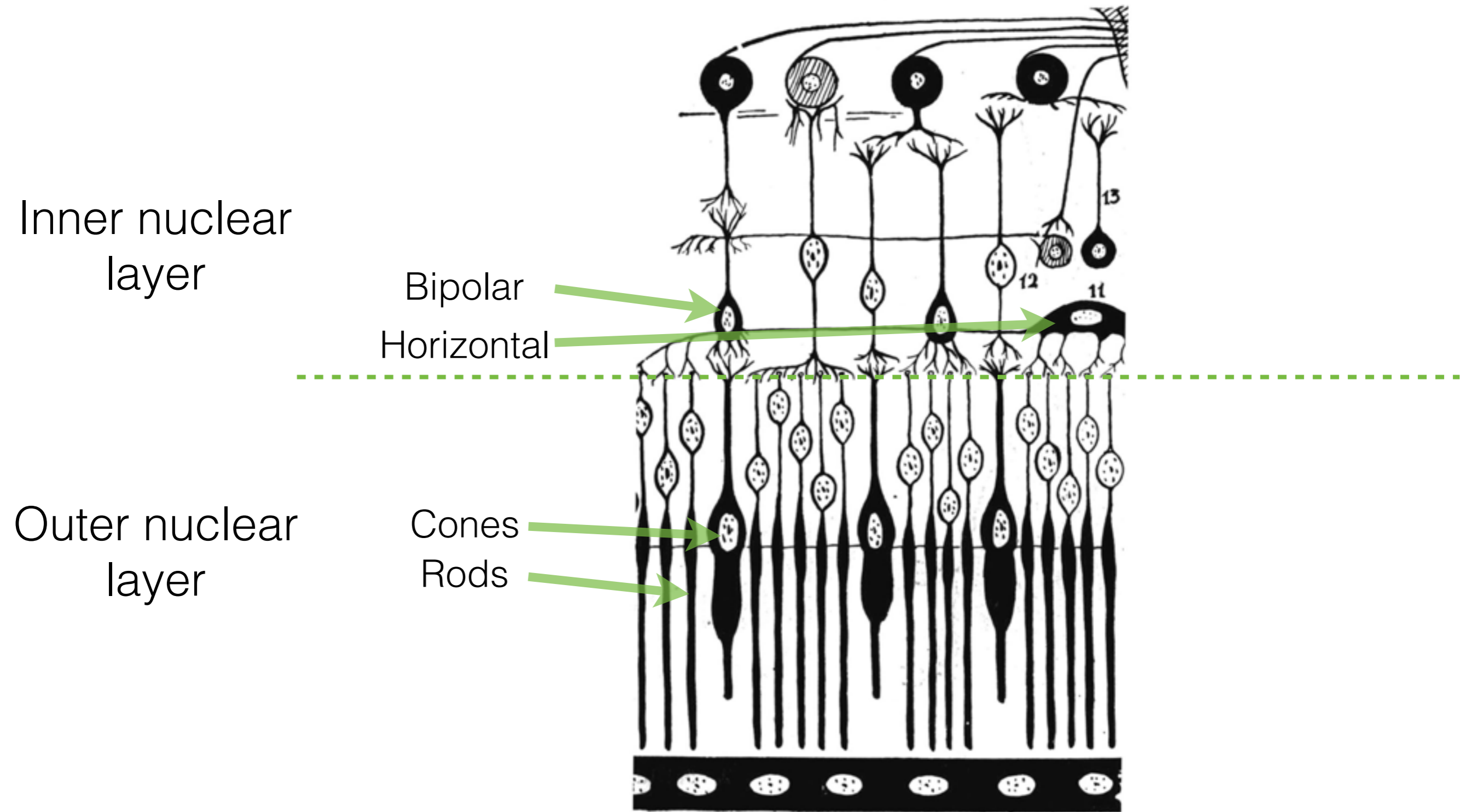
Eye and retina



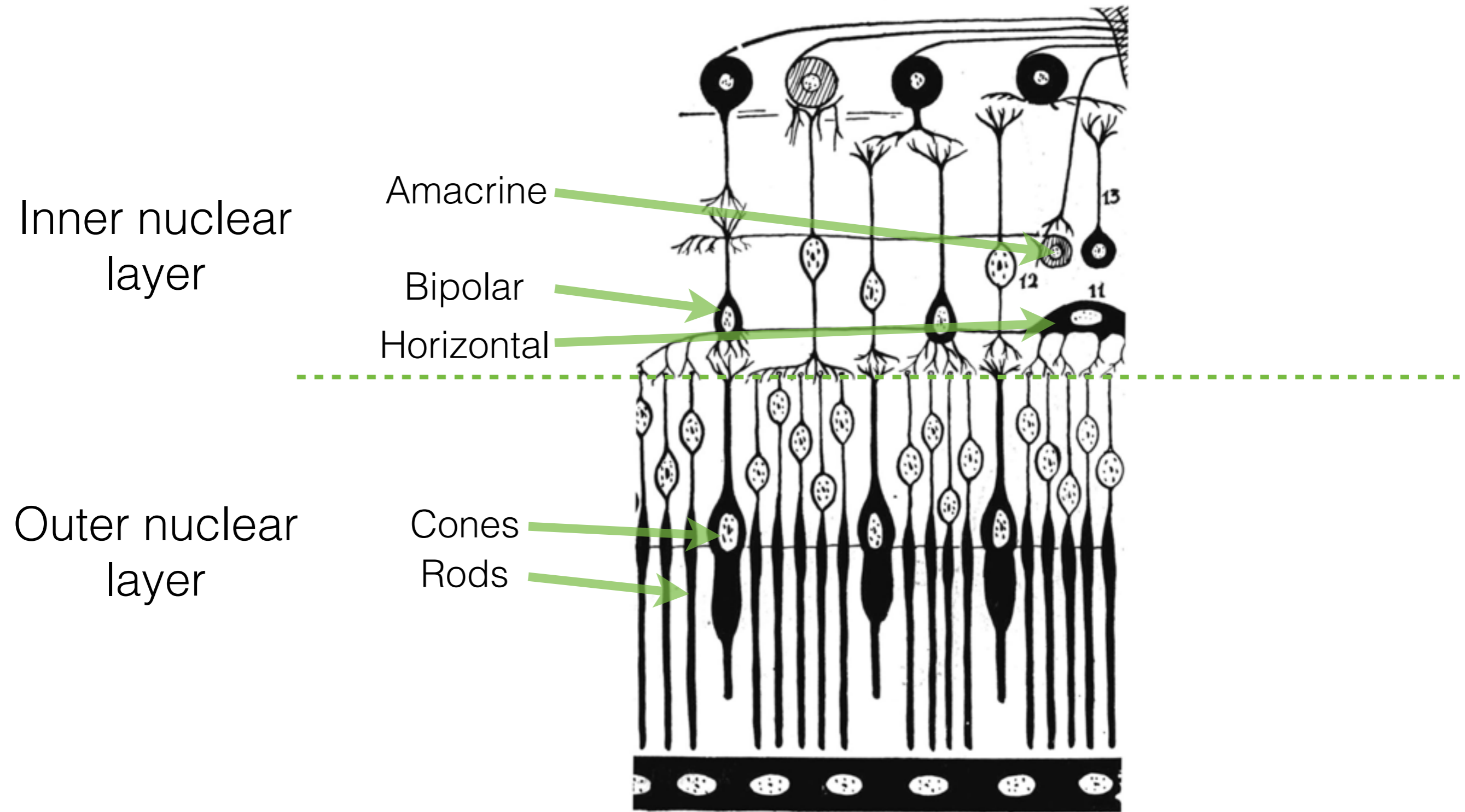
Eye and retina



Eye and retina



Eye and retina



Eye and retina

Ganglion cell layer

Inner nuclear layer

Outer nuclear layer

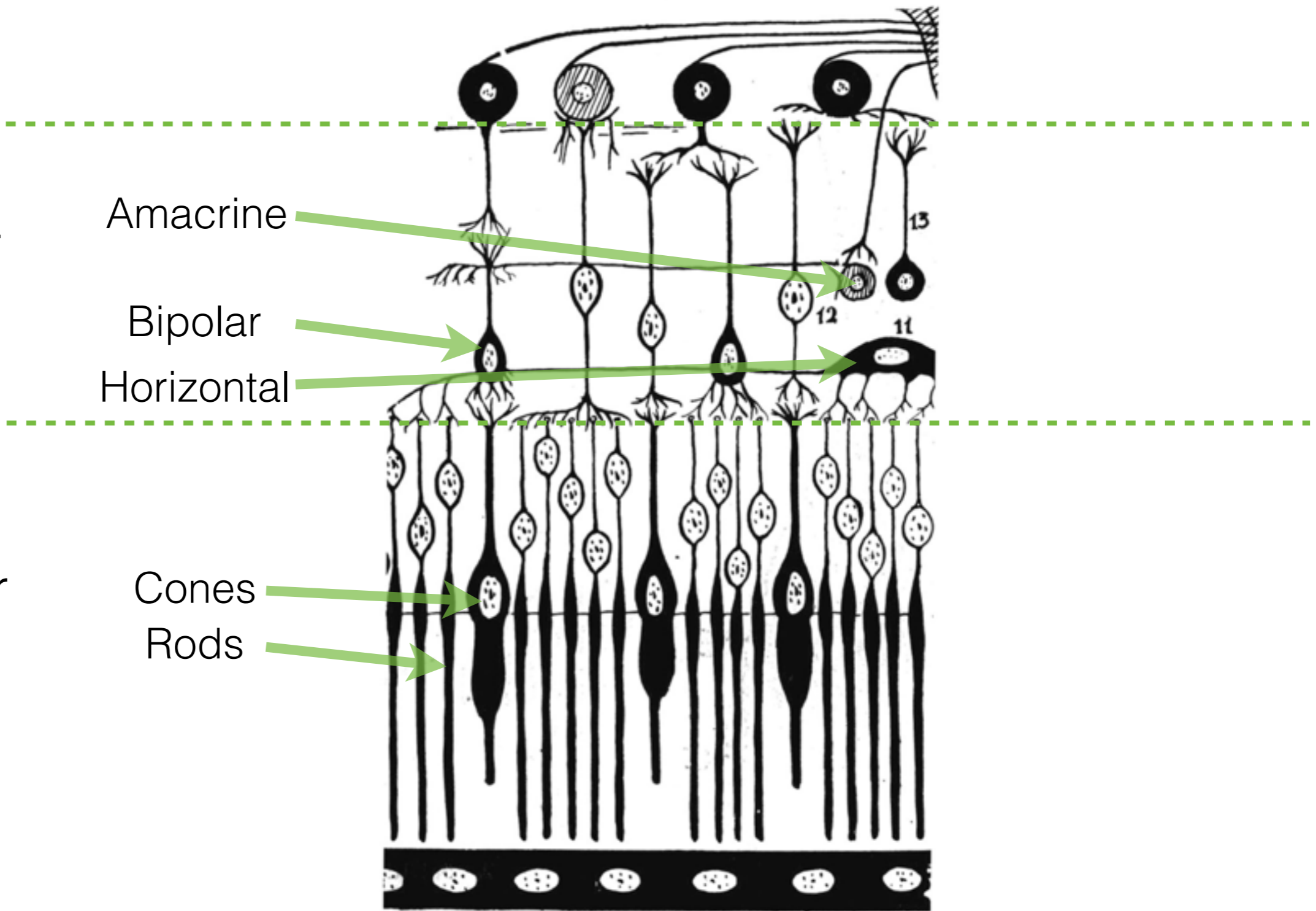
Amacrine

Bipolar

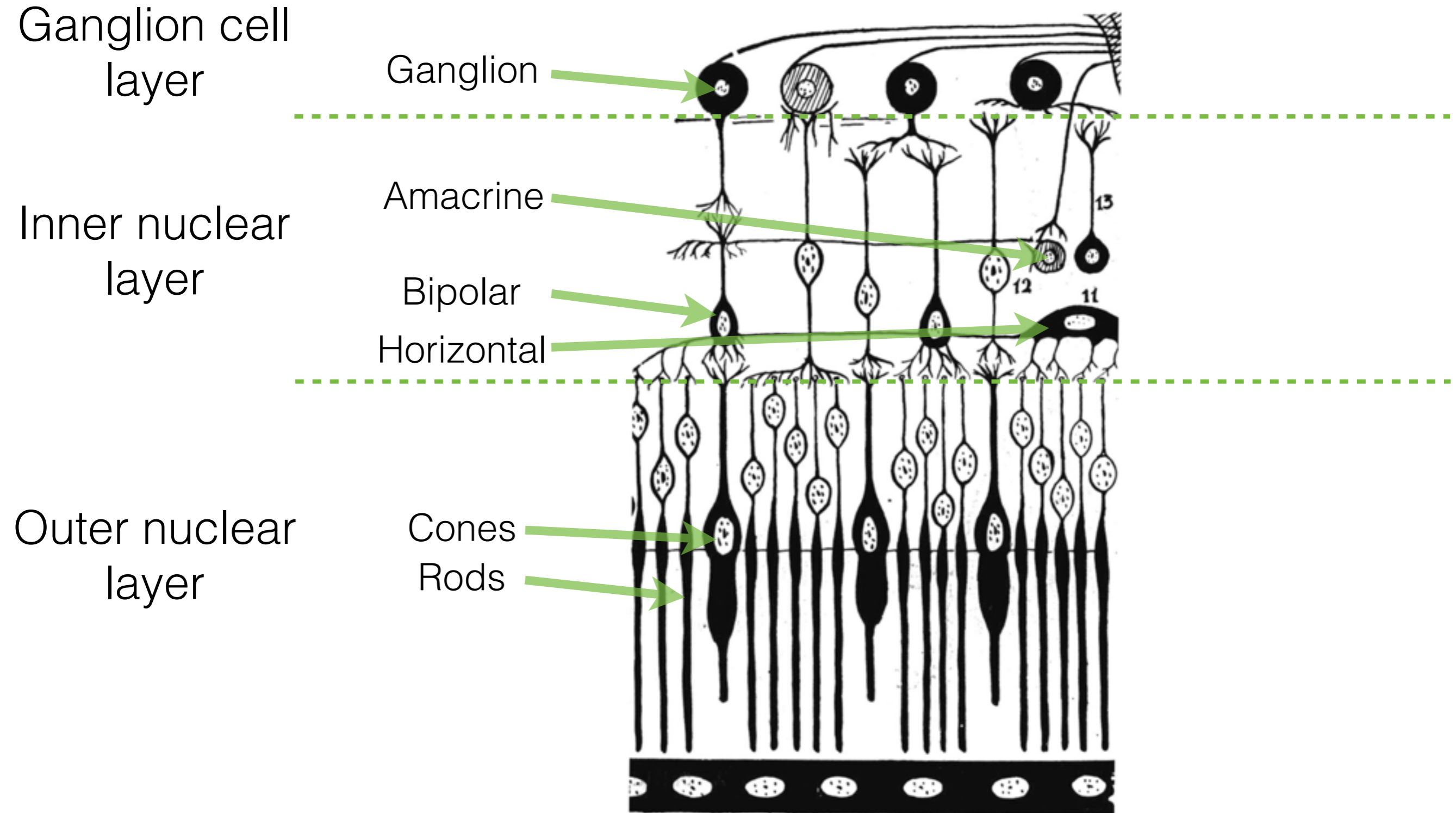
Horizontal

Cones

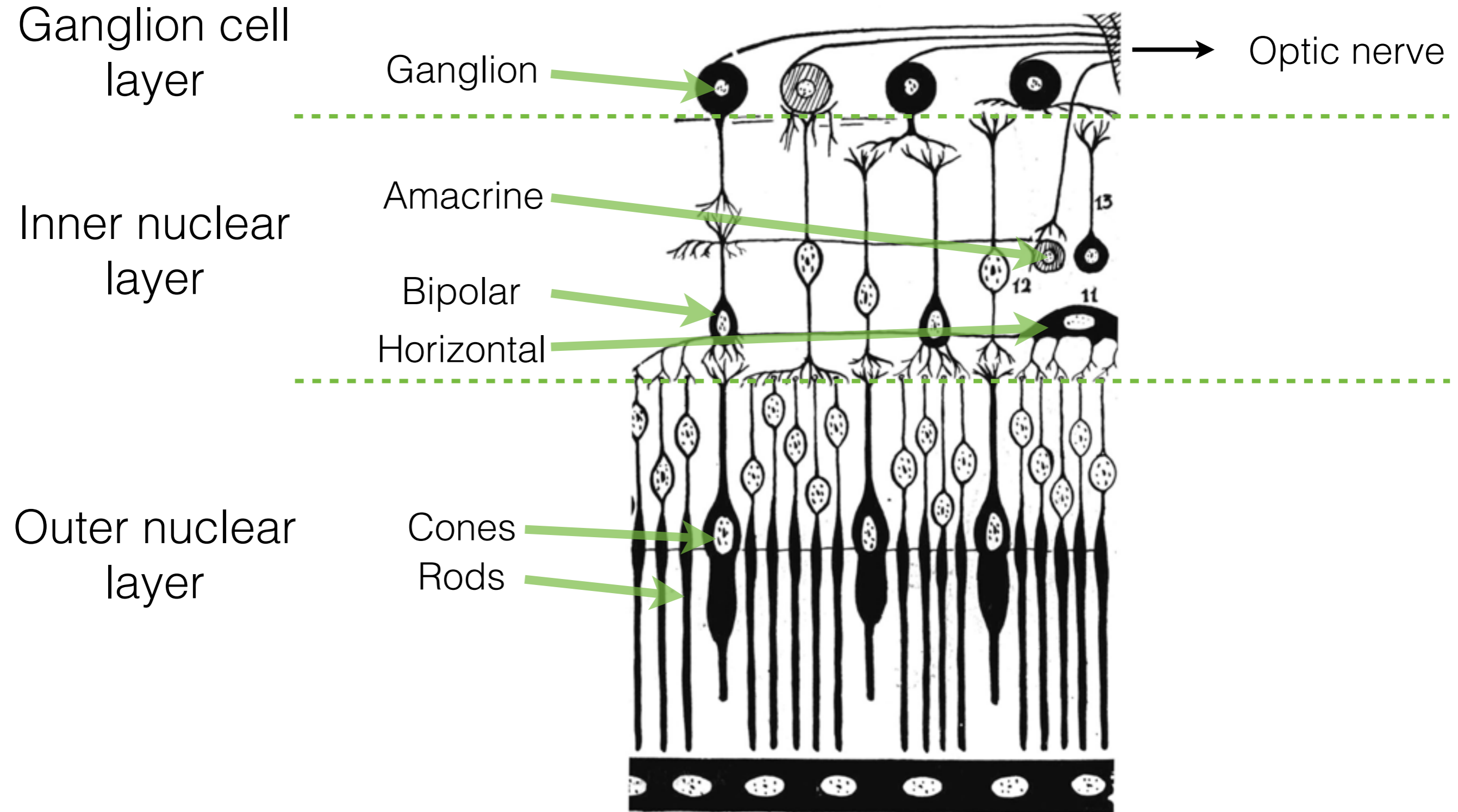
Rods



Eye and retina



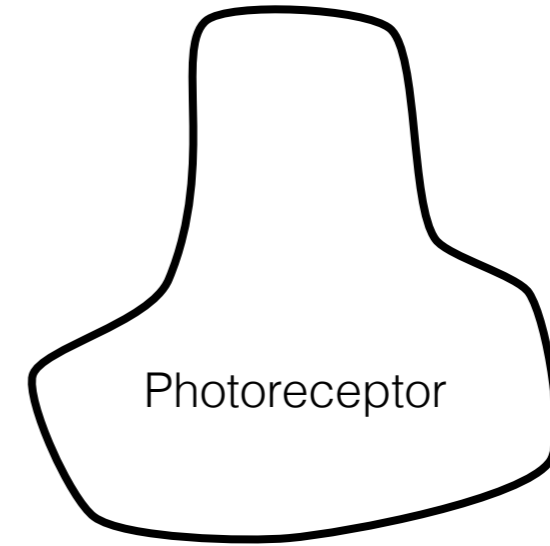
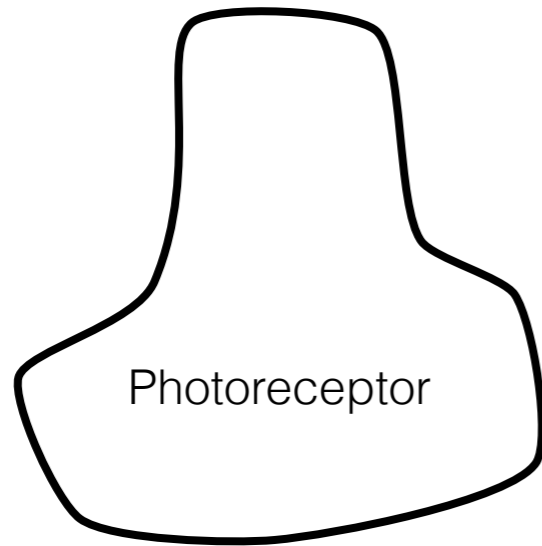
Eye and retina



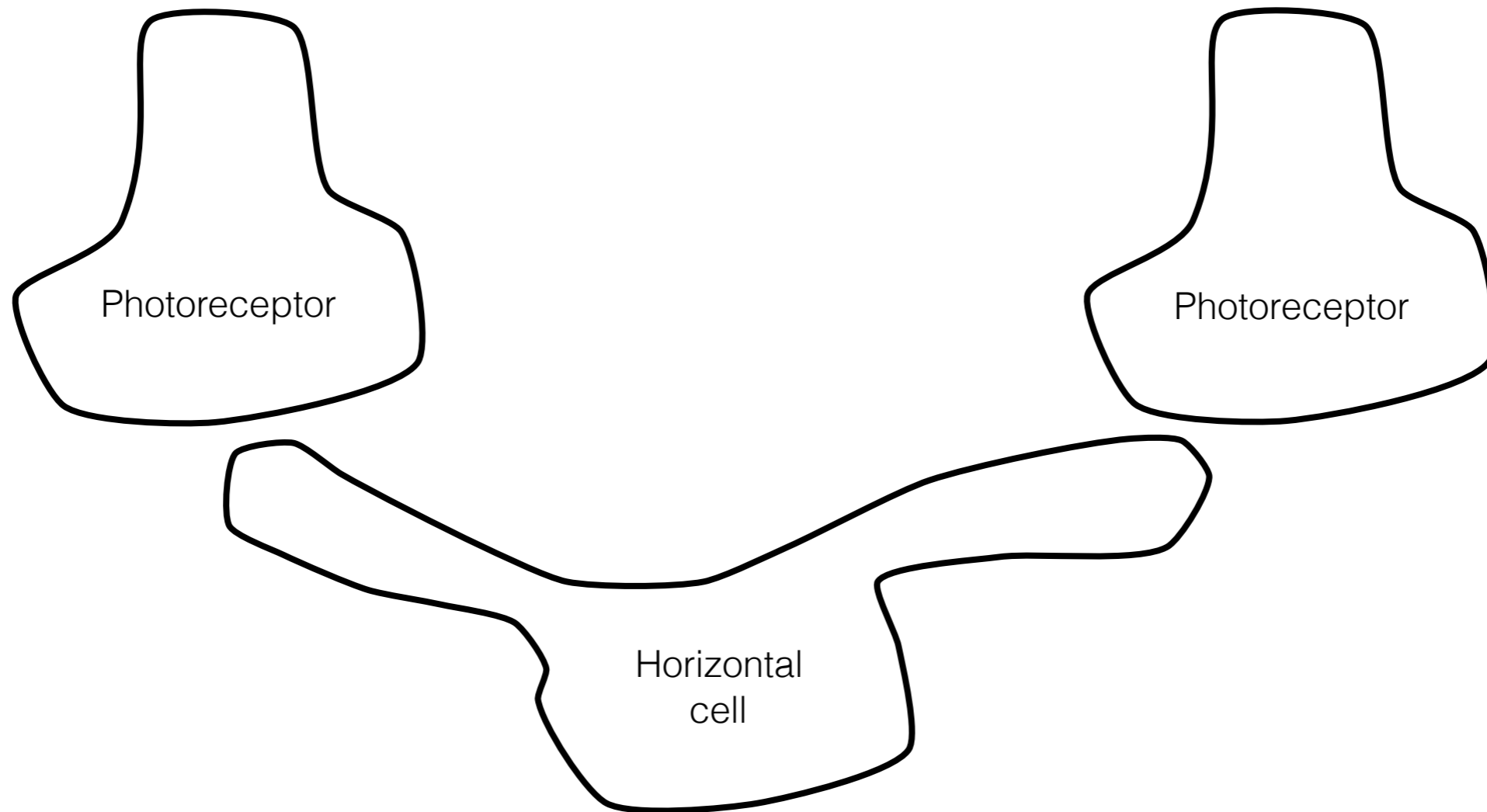
What does the retina *do*?

Functional organization of the retina

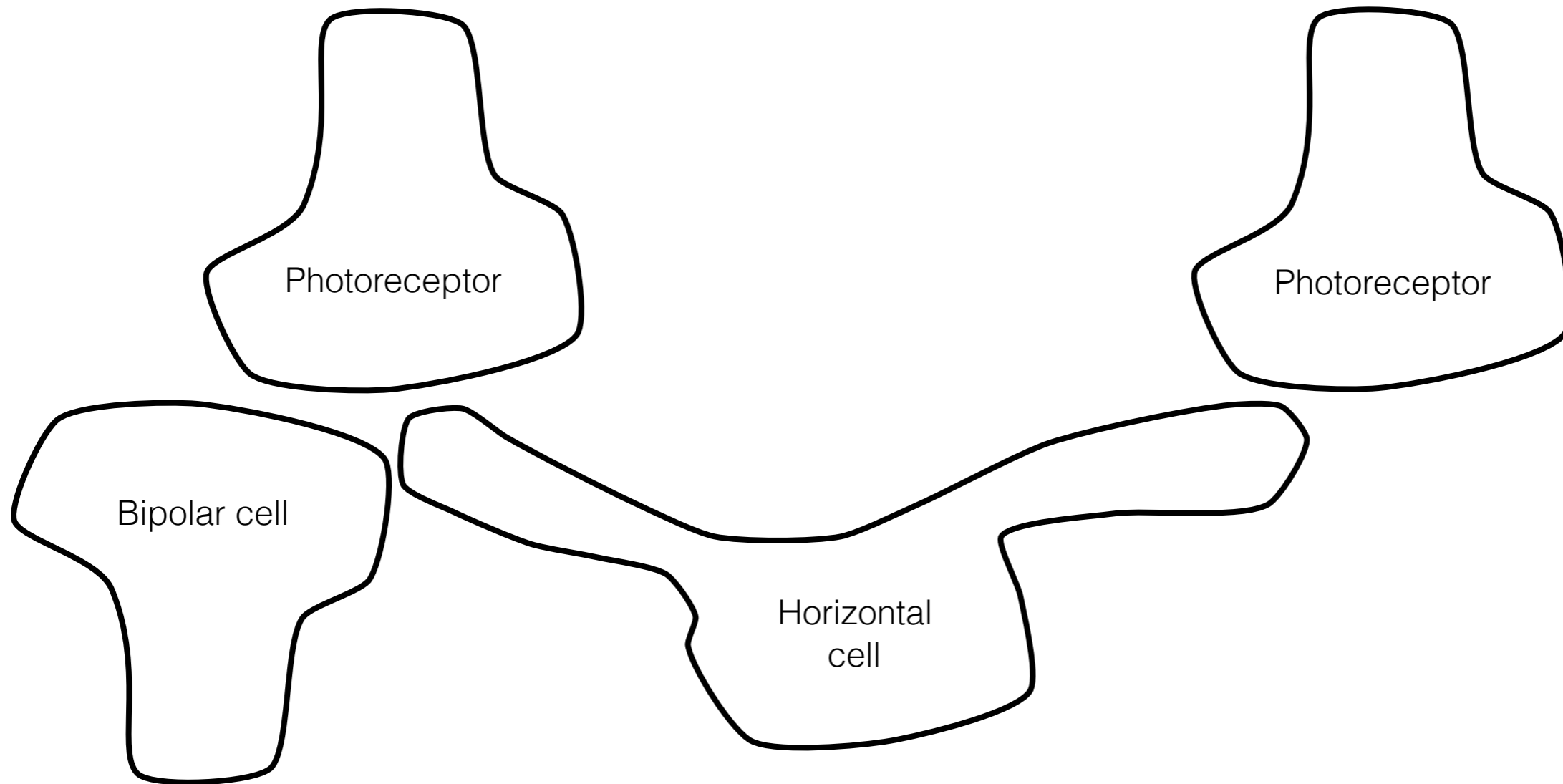
Functional organization of the retina



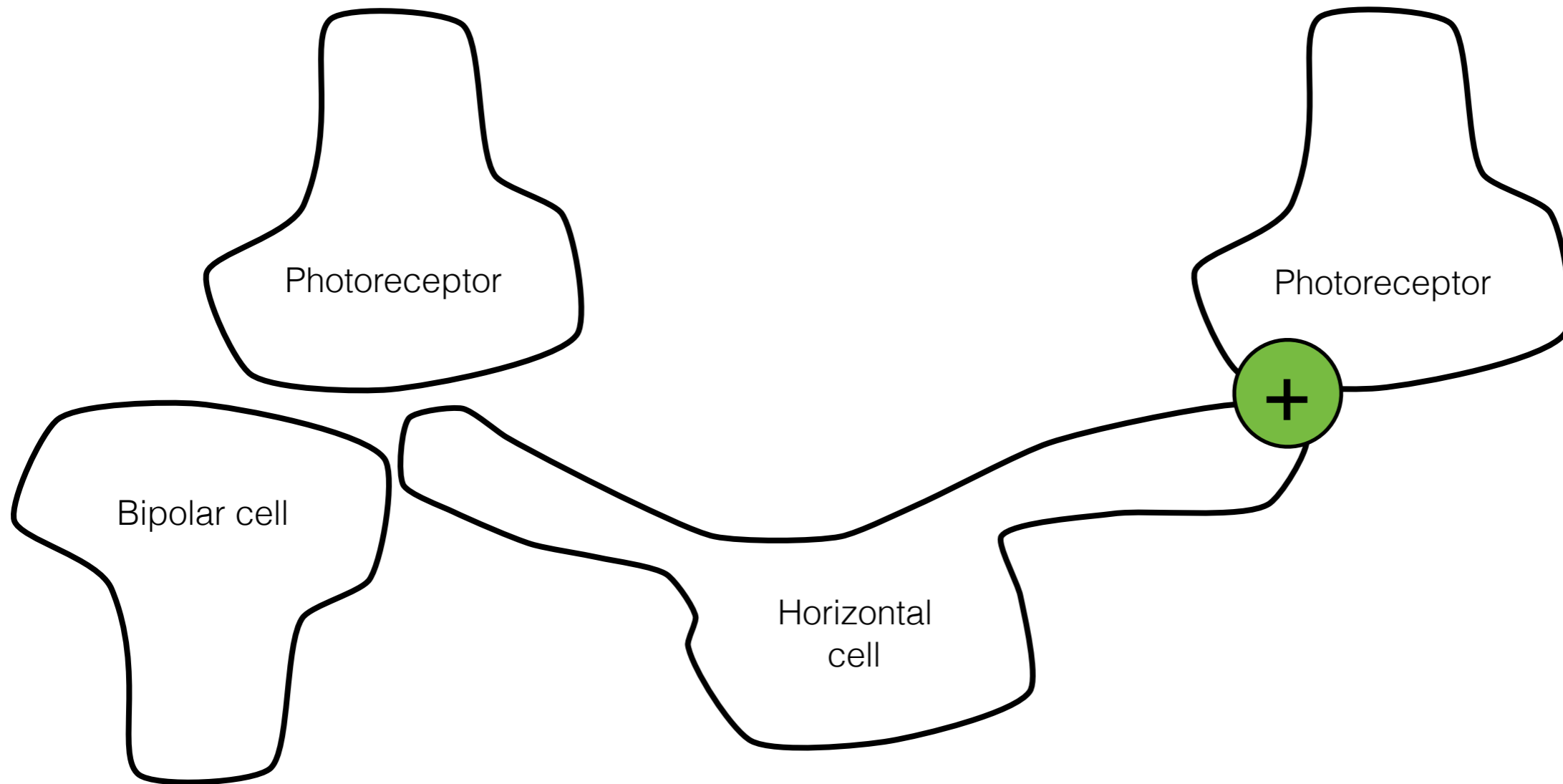
Functional organization of the retina



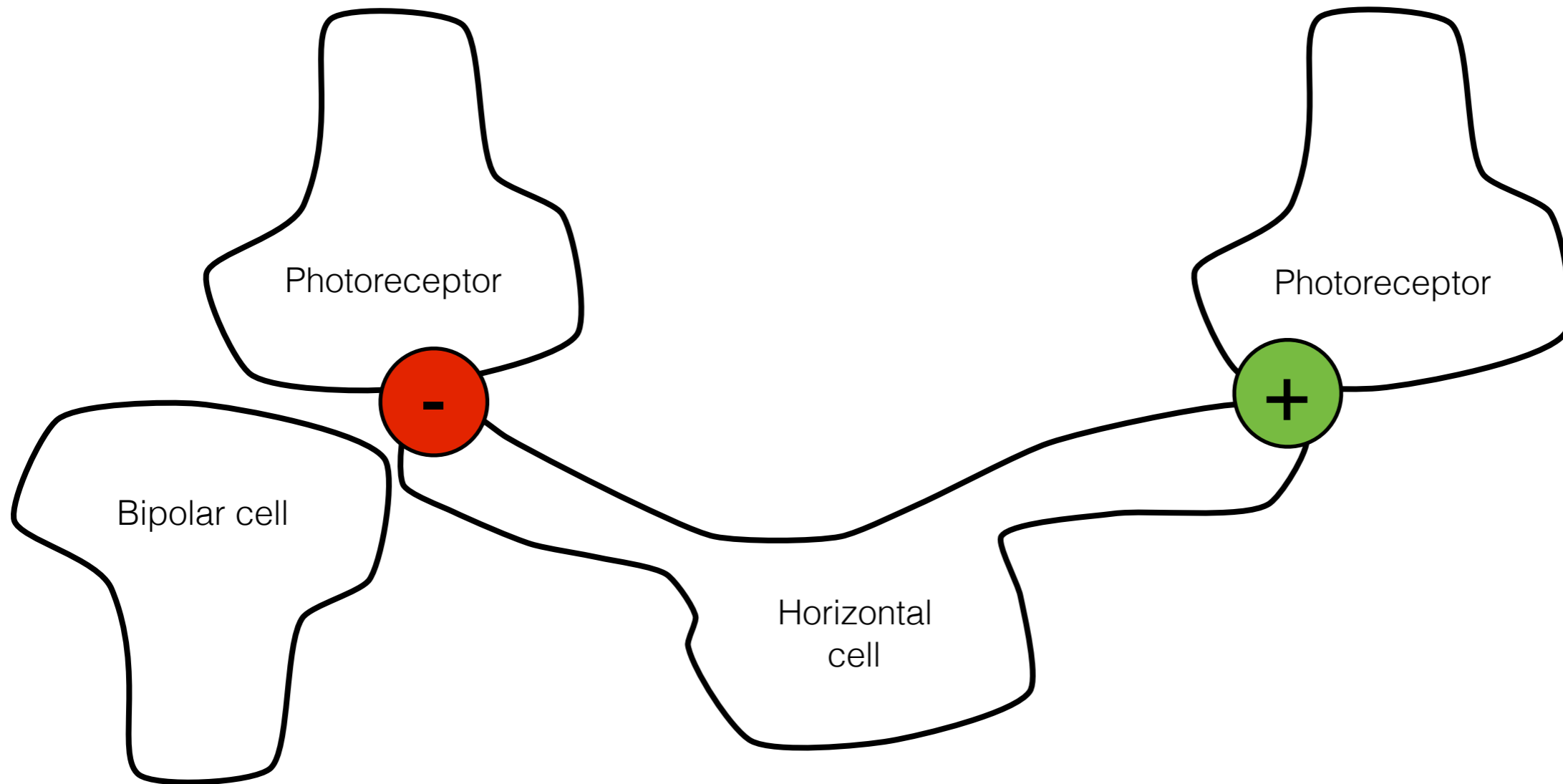
Functional organization of the retina



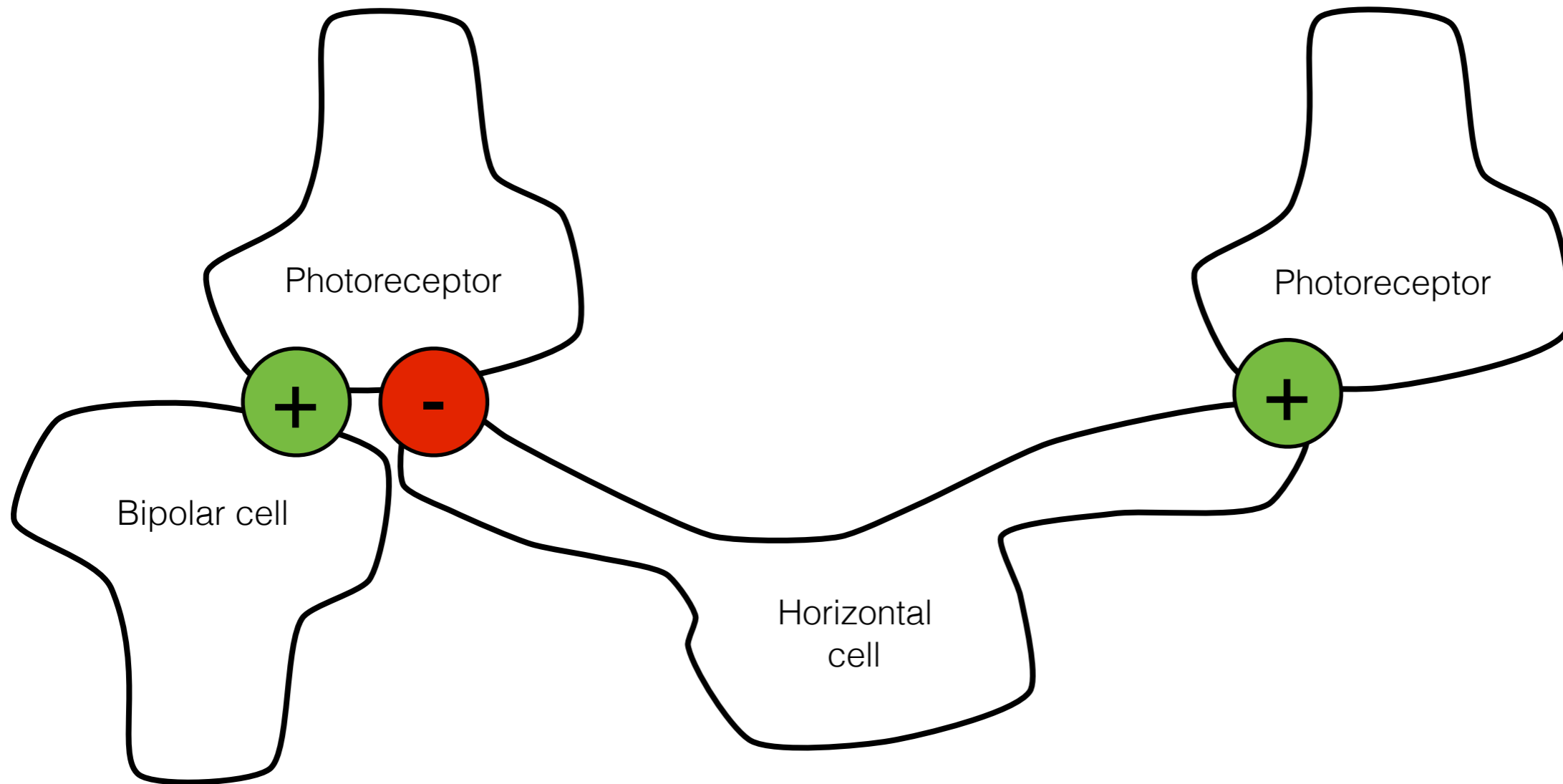
Functional organization of the retina



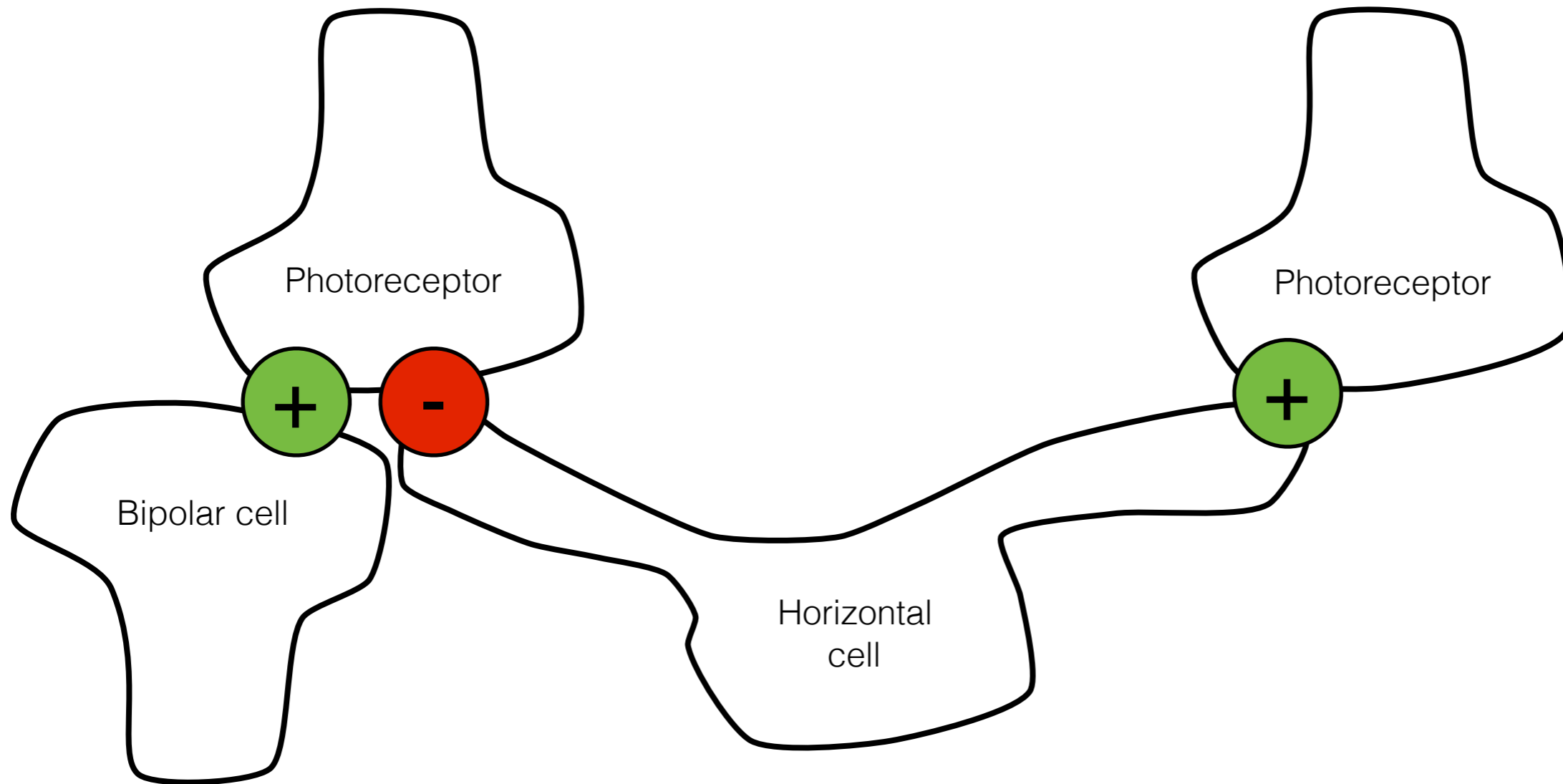
Functional organization of the retina



Functional organization of the retina

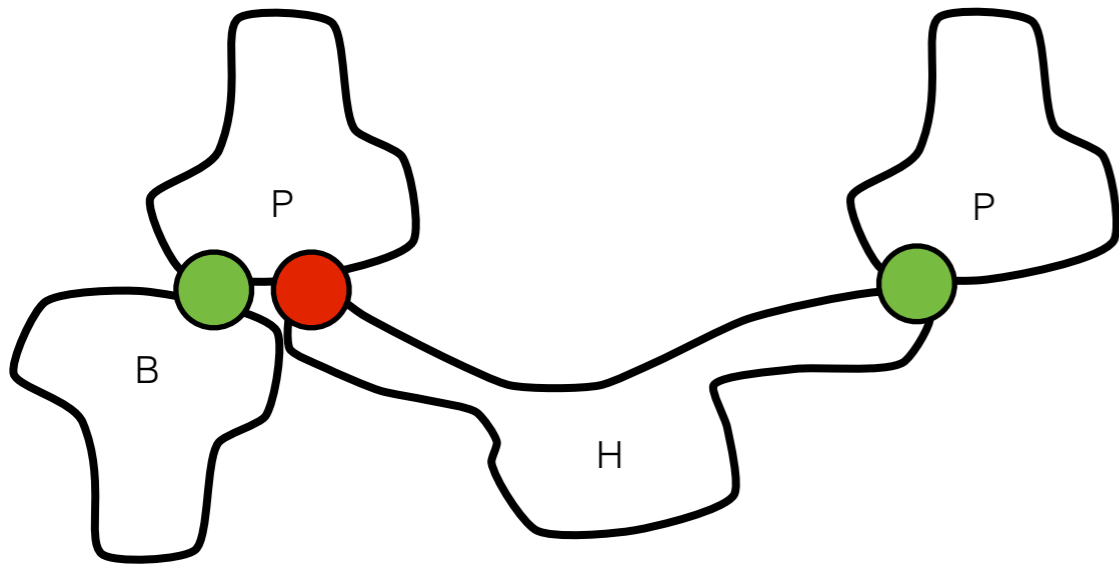


Functional organization of the retina

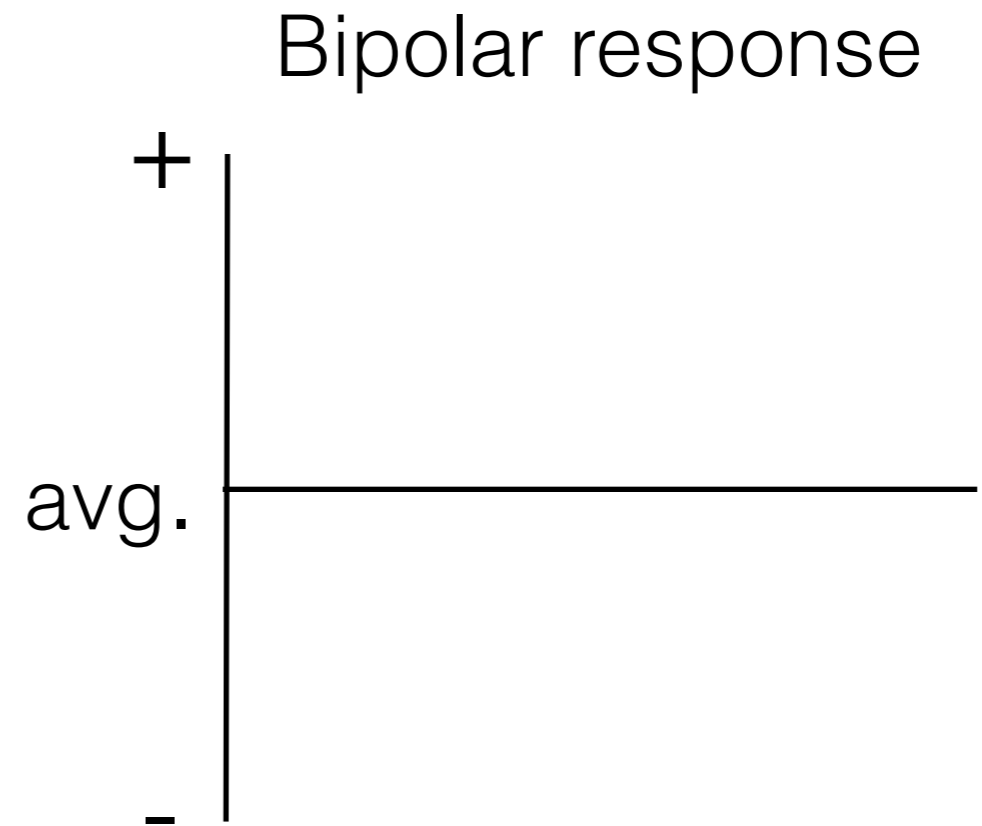
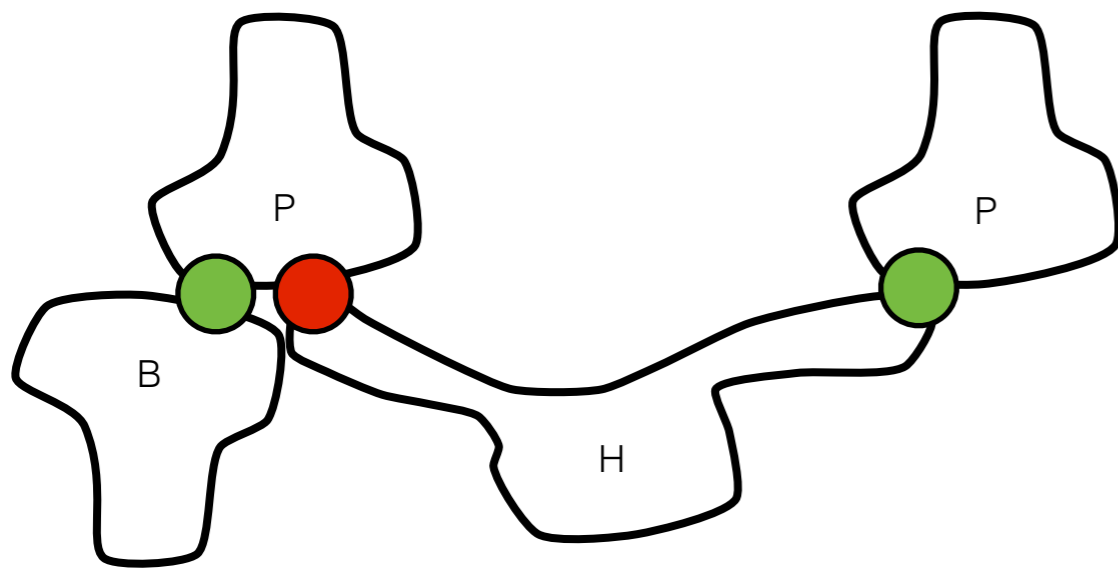


Lateral inhibition

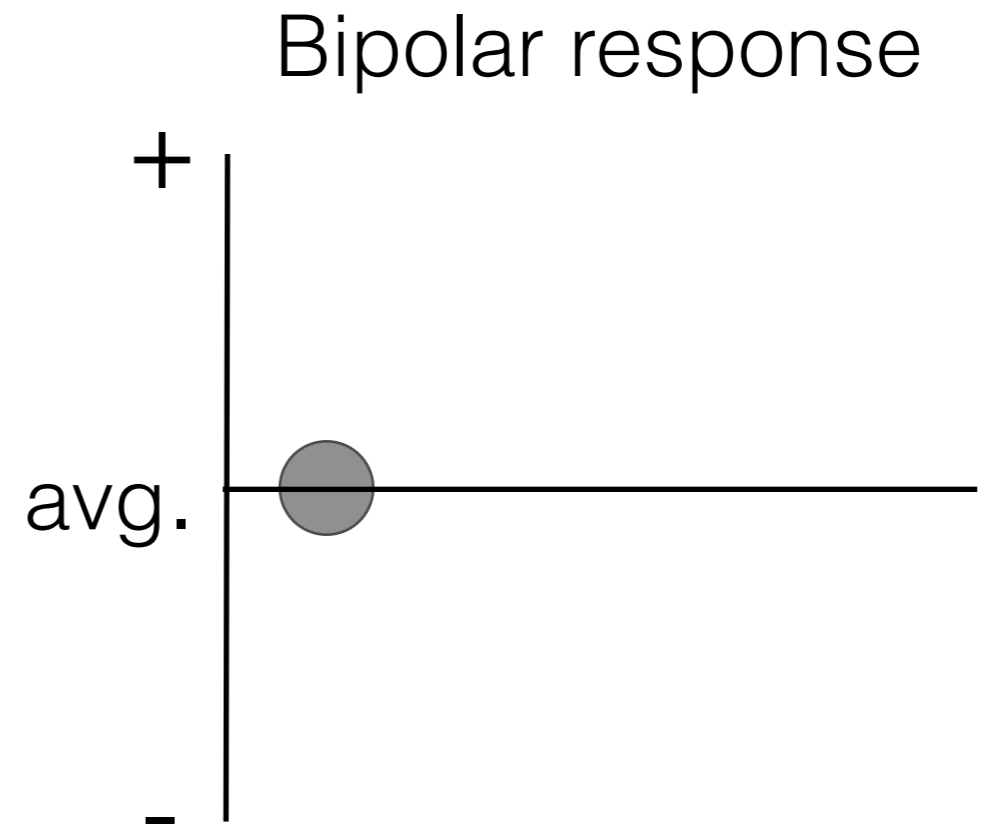
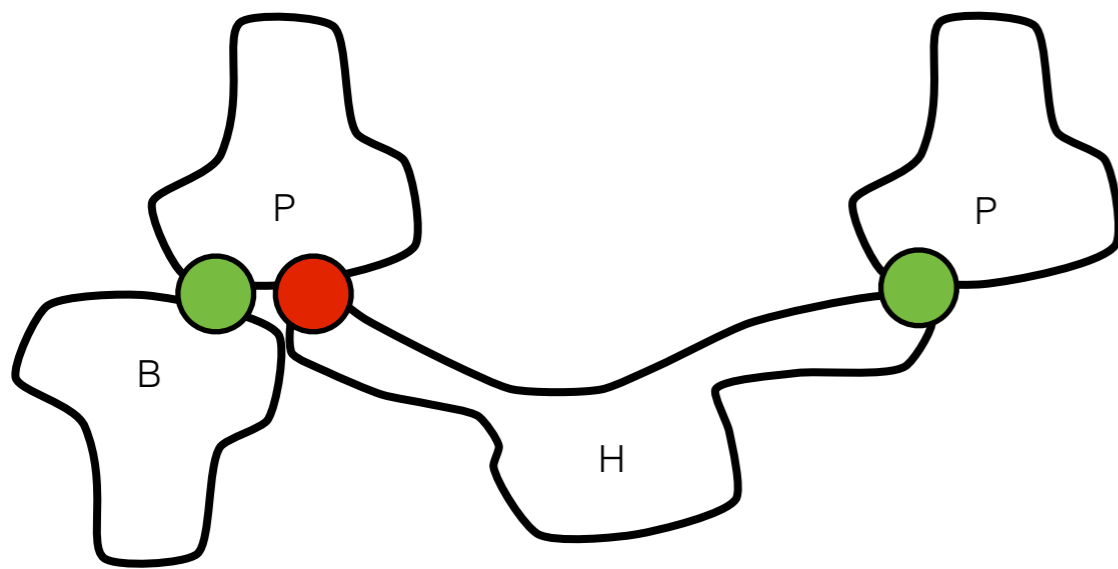
Functional organization of the retina



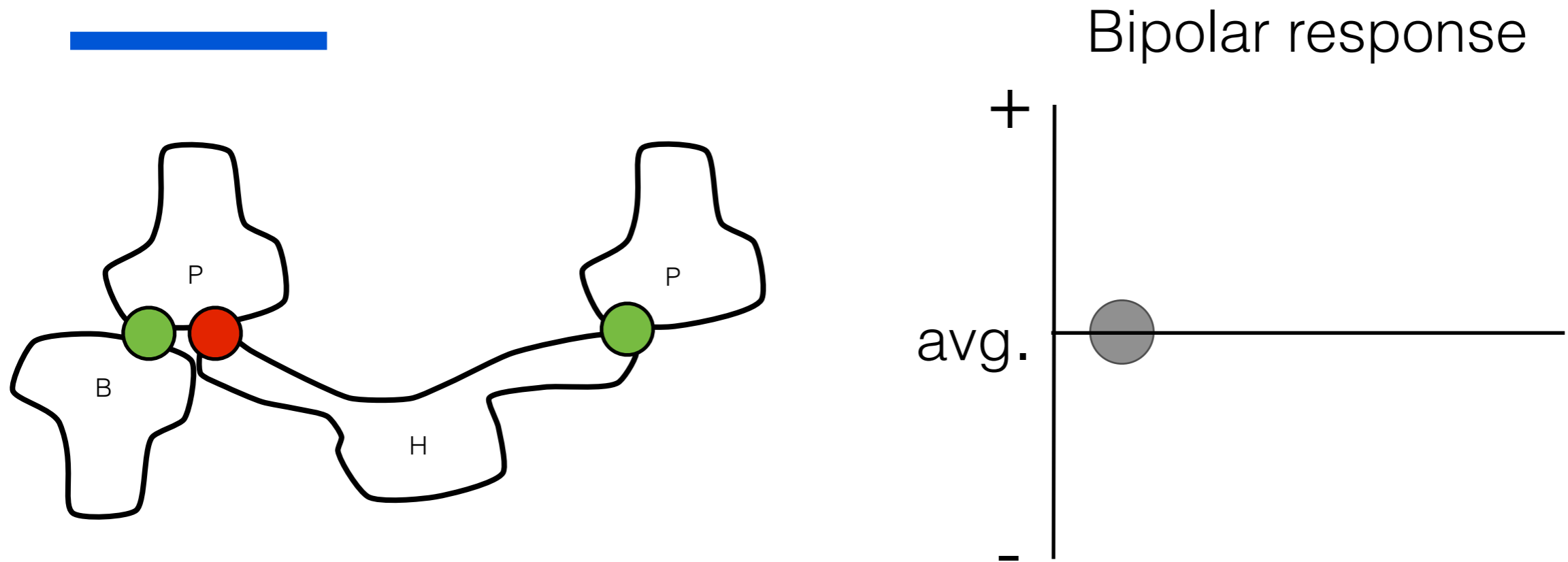
Functional organization of the retina



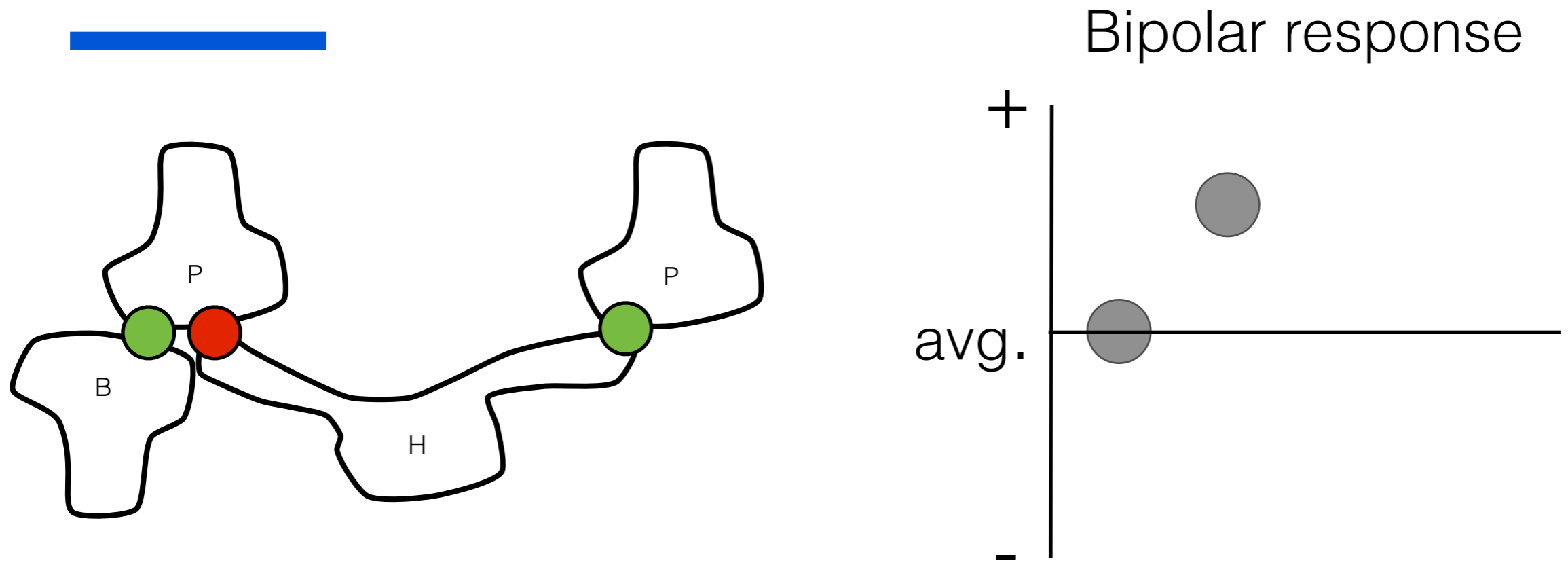
Functional organization of the retina



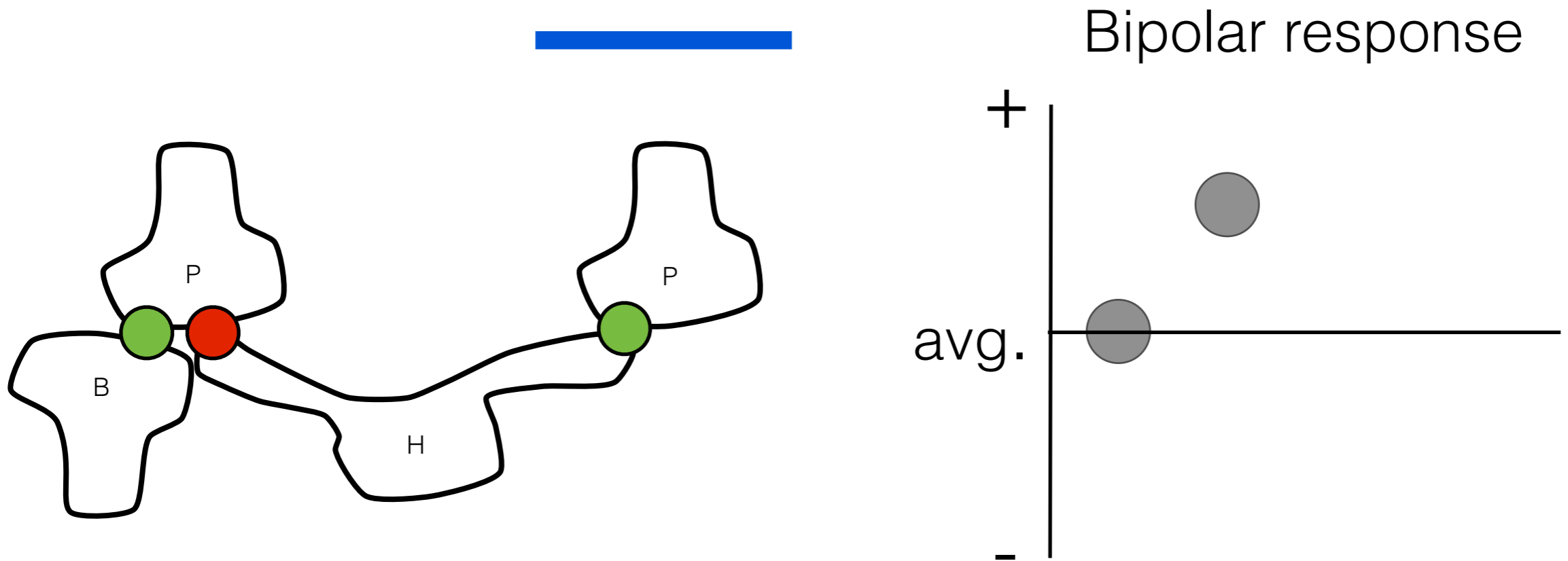
Functional organization of the retina



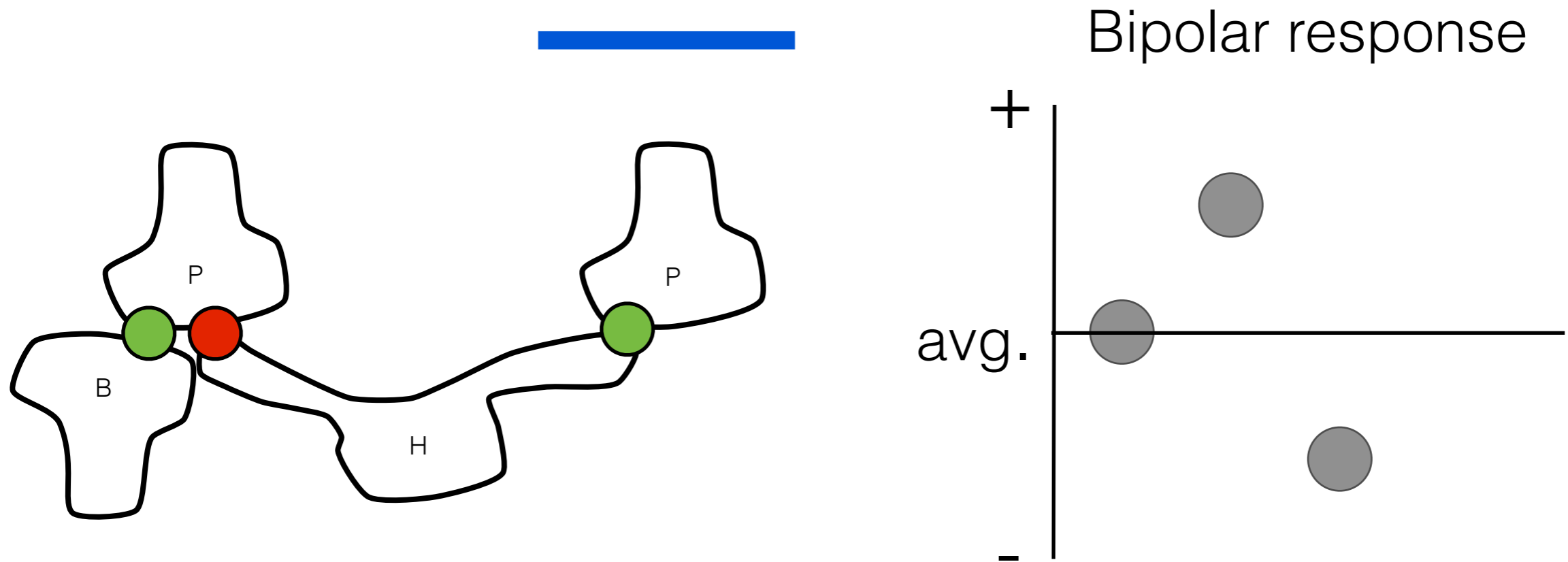
Functional organization of the retina



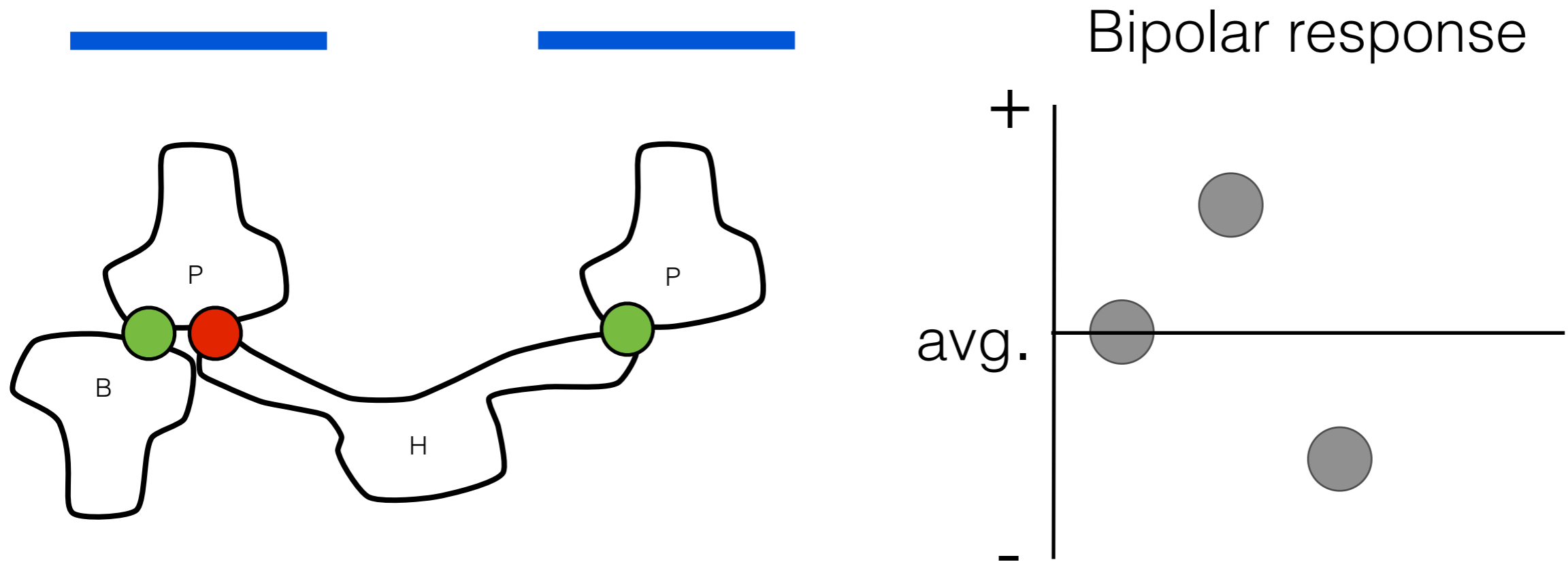
Functional organization of the retina



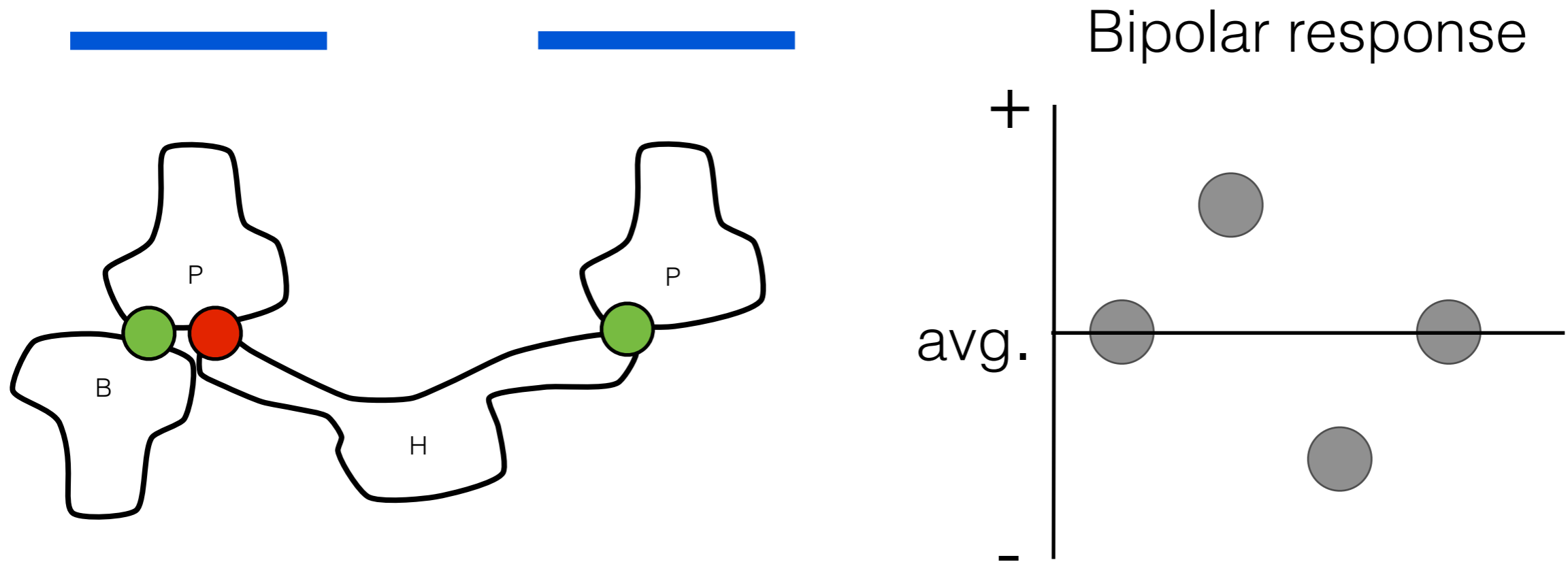
Functional organization of the retina



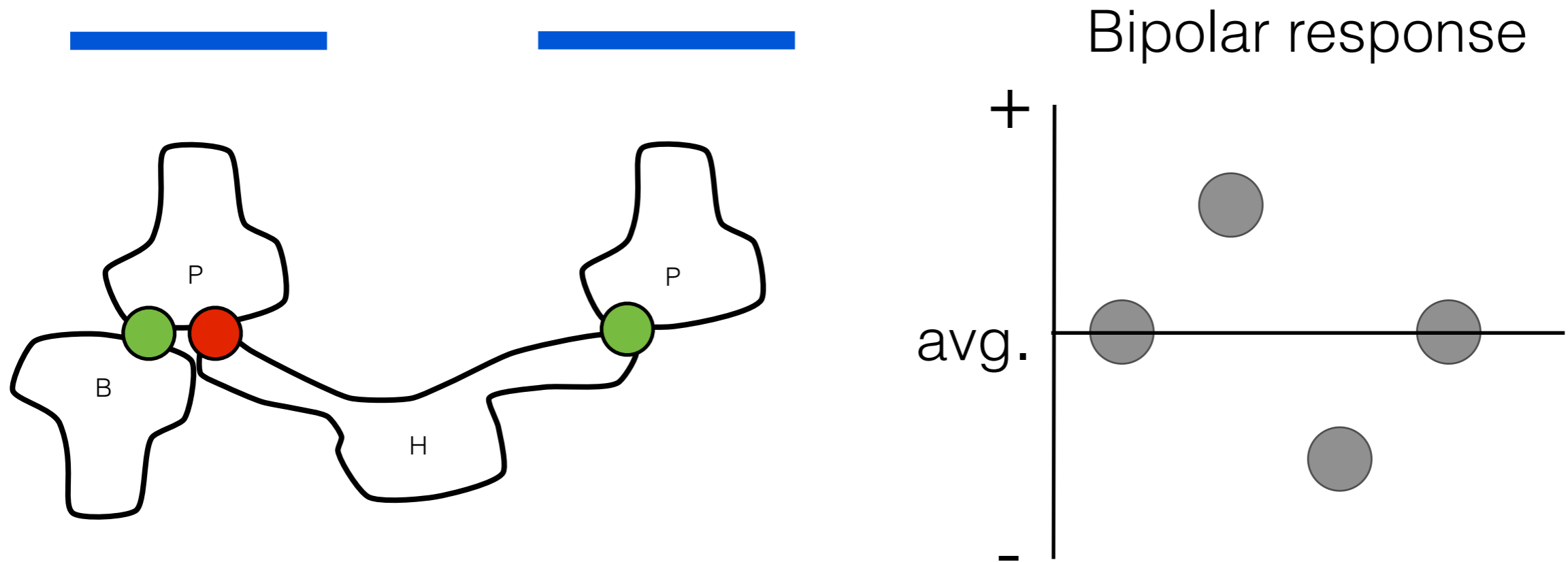
Functional organization of the retina



Functional organization of the retina



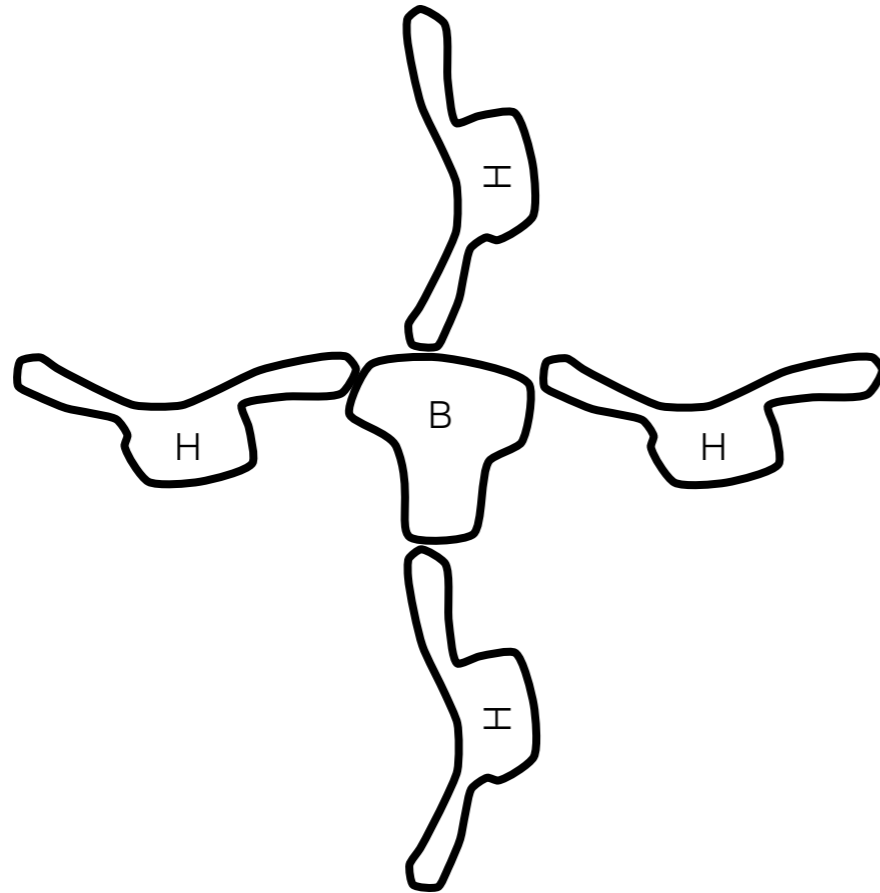
Functional organization of the retina



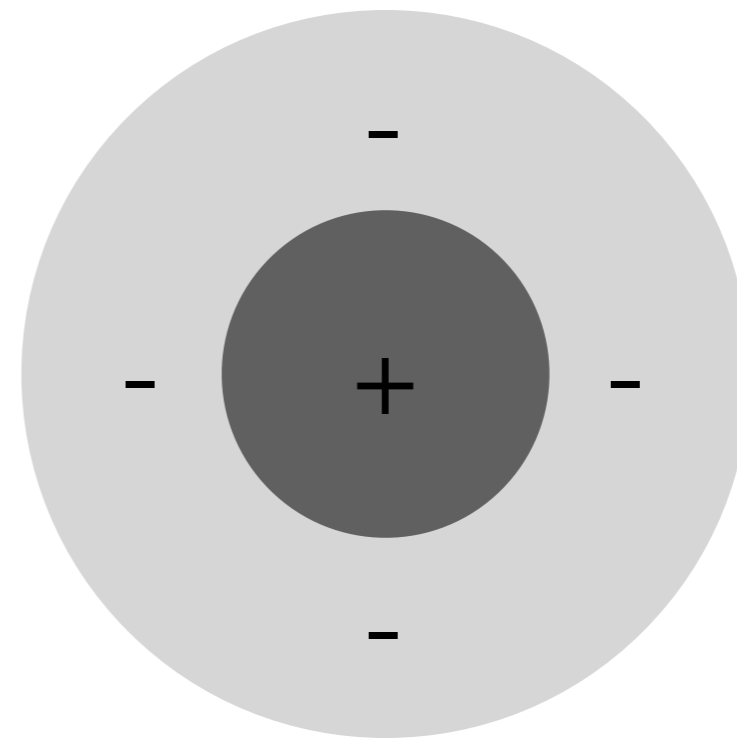
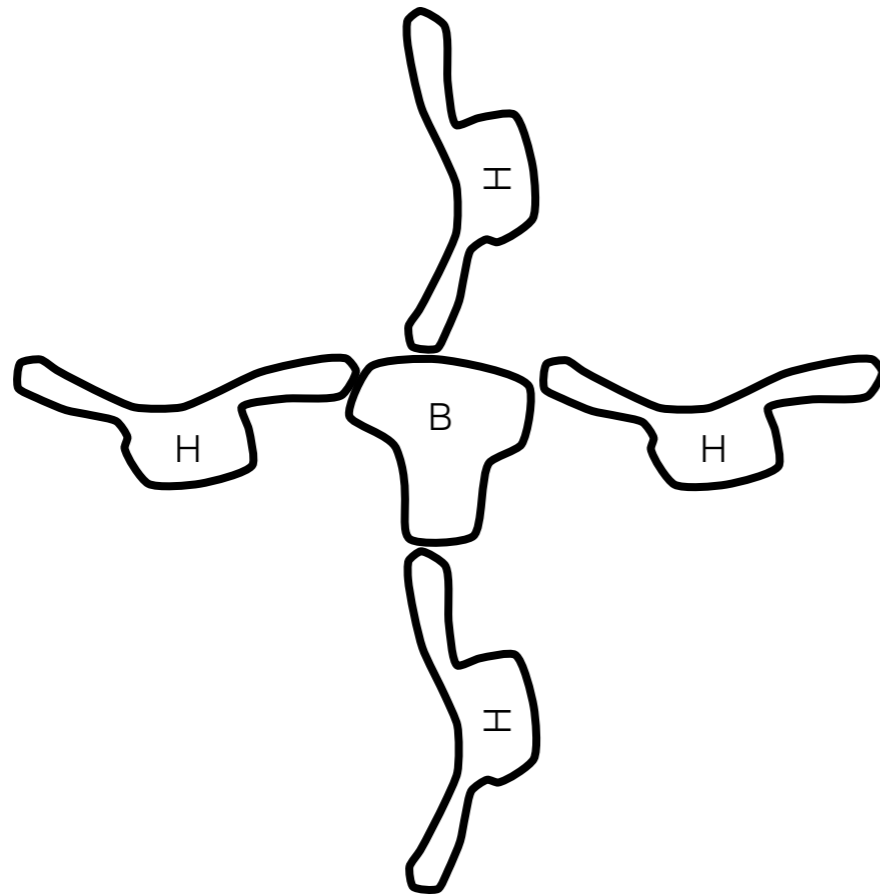
Signals *differences* in light

Functional organization of the retina

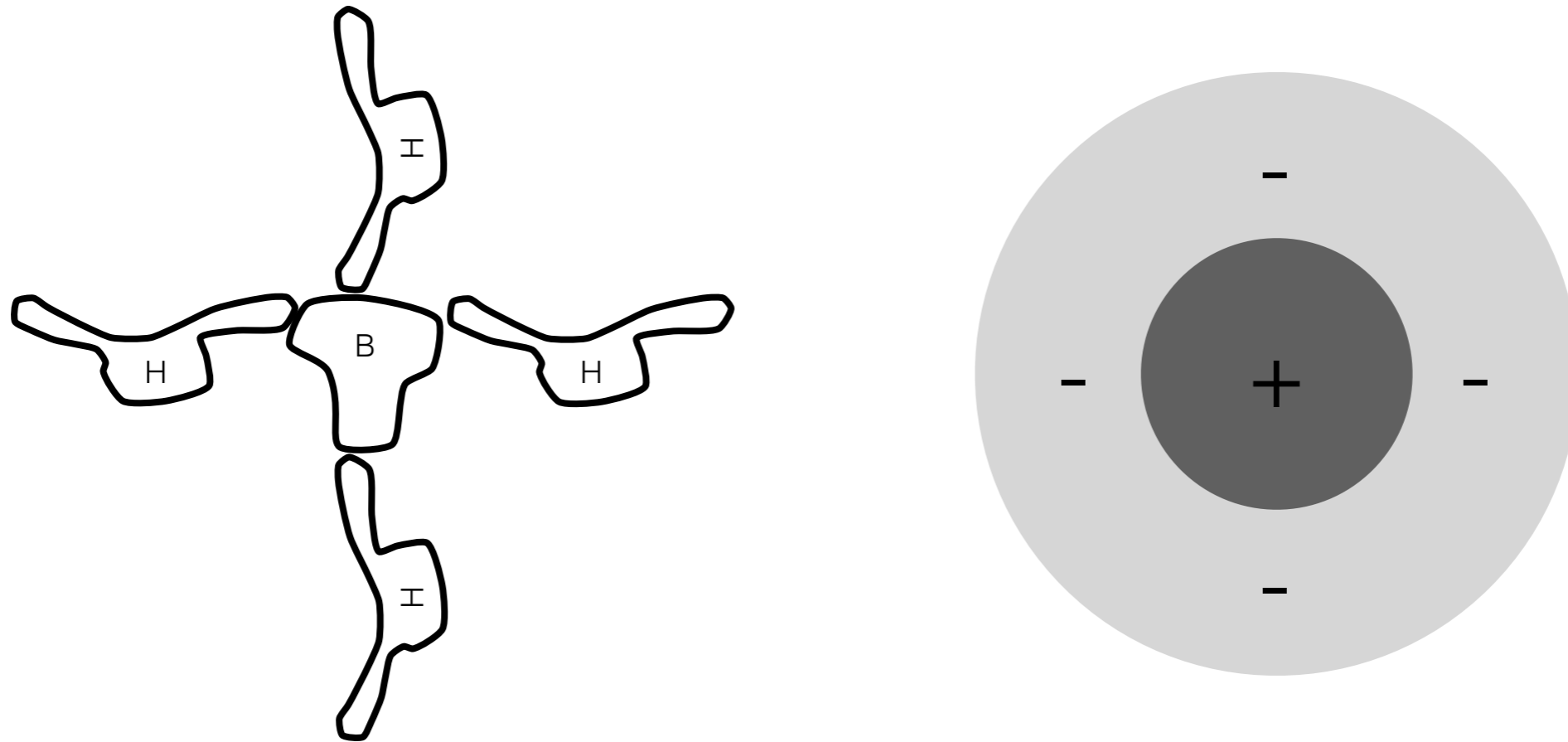
Functional organization of the retina



Functional organization of the retina



Functional organization of the retina



Center-surround receptive field

Center-surround receptive fields

Center-surround receptive fields



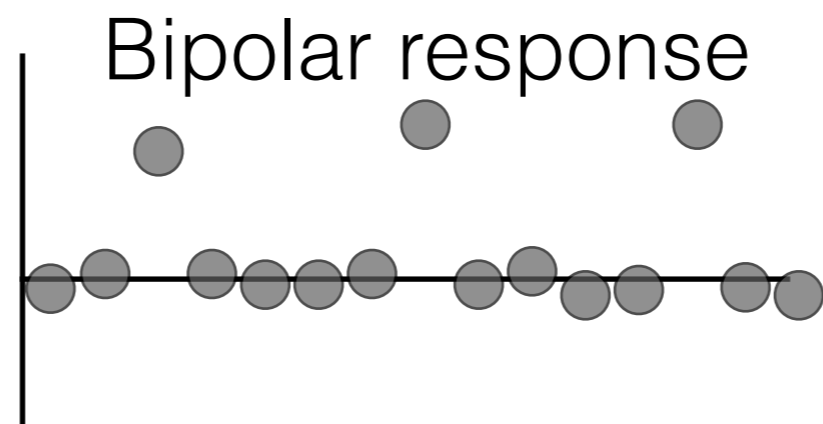
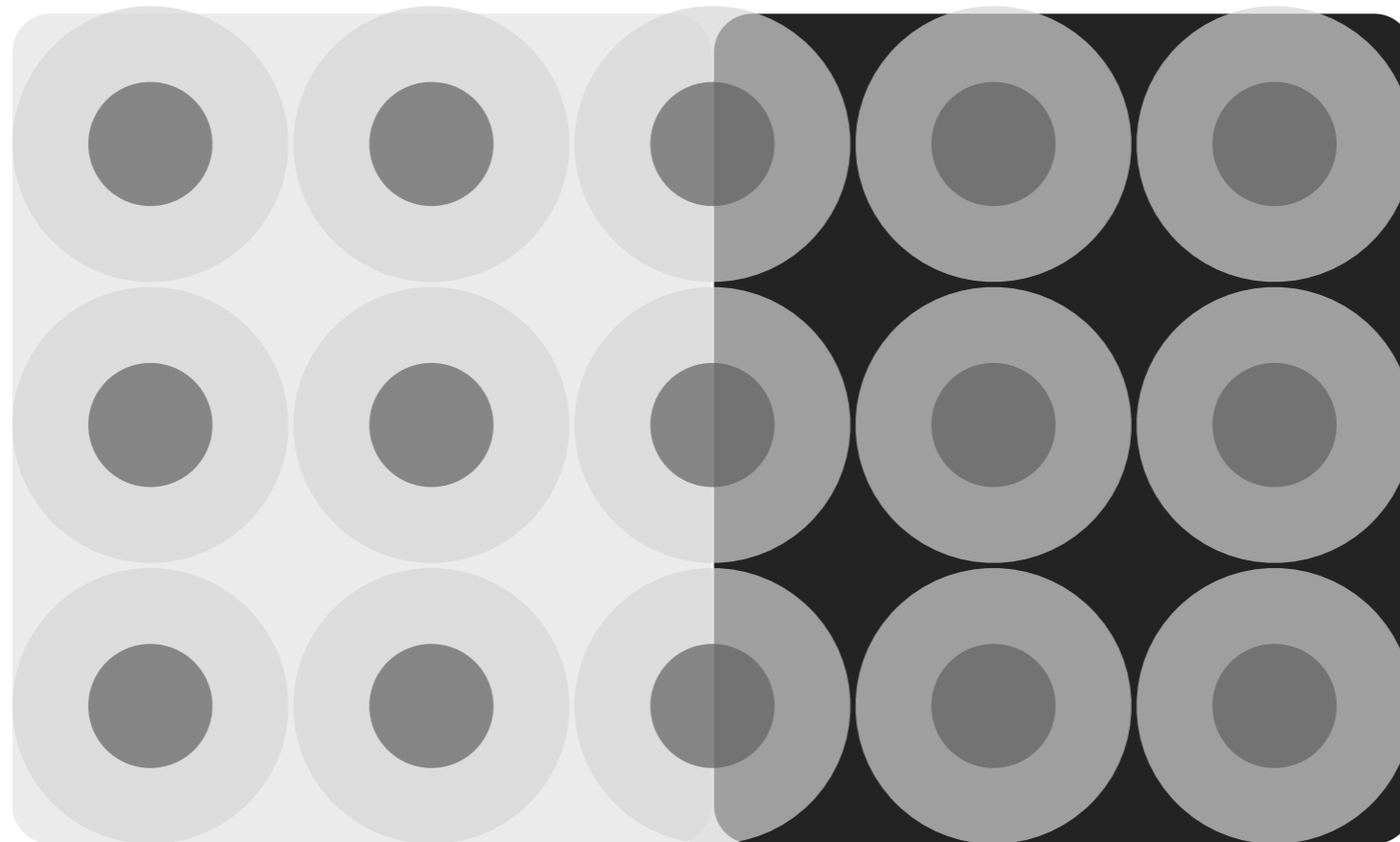
Center-surround receptive fields



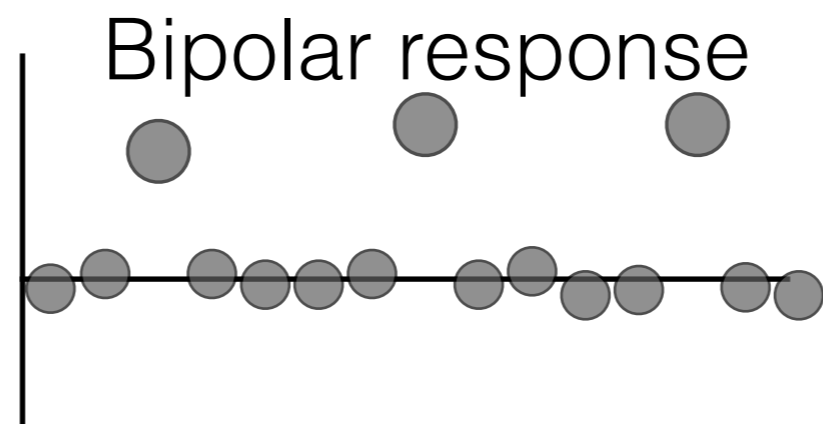
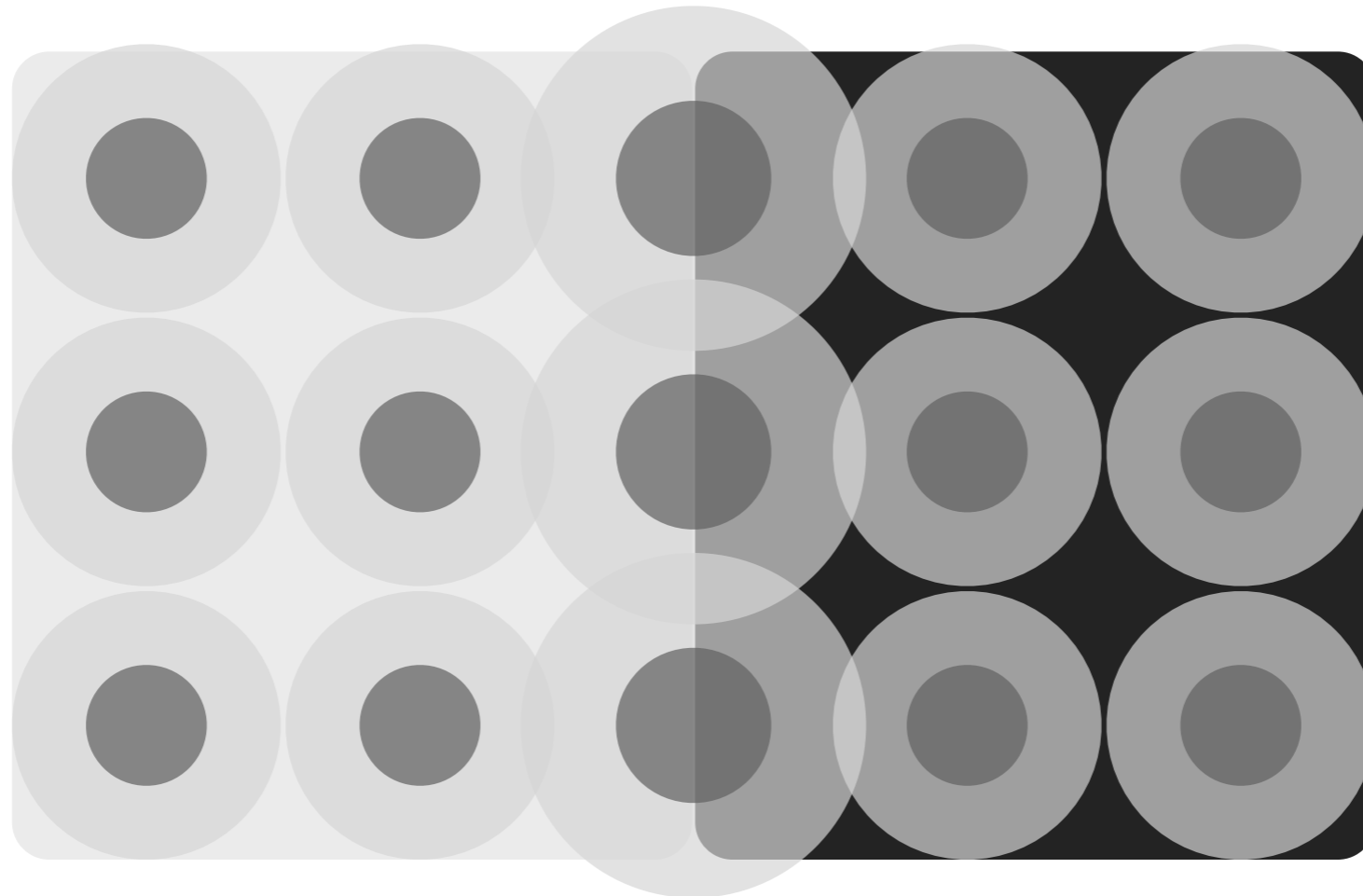
Bipolar response

A simple coordinate system with a vertical y-axis and a horizontal x-axis.

Center-surround receptive fields



Center-surround receptive fields



Center-surround receptive fields

Center-surround receptive fields

Signal *differences* in light

Center-surround receptive fields

~~—Signal *differences* in light—~~

Center-surround receptive fields

~~—Signal *differences* in light—~~

Edge detectors!

Center-surround receptive fields



Center-surround receptive fields



Center-surround receptive fields



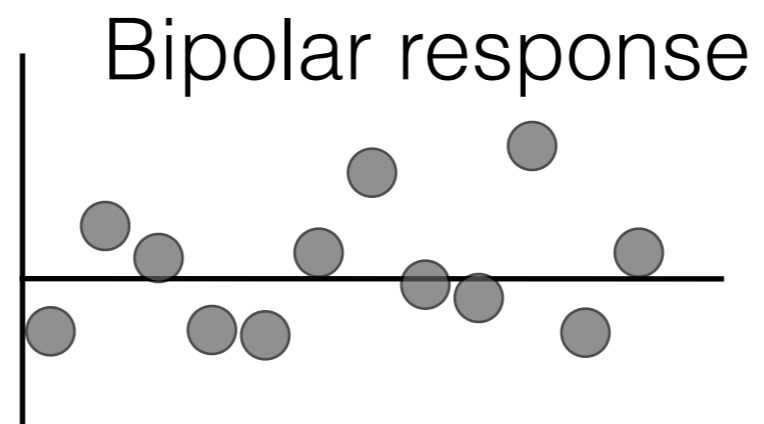
Center-surround receptive fields



Bipolar response



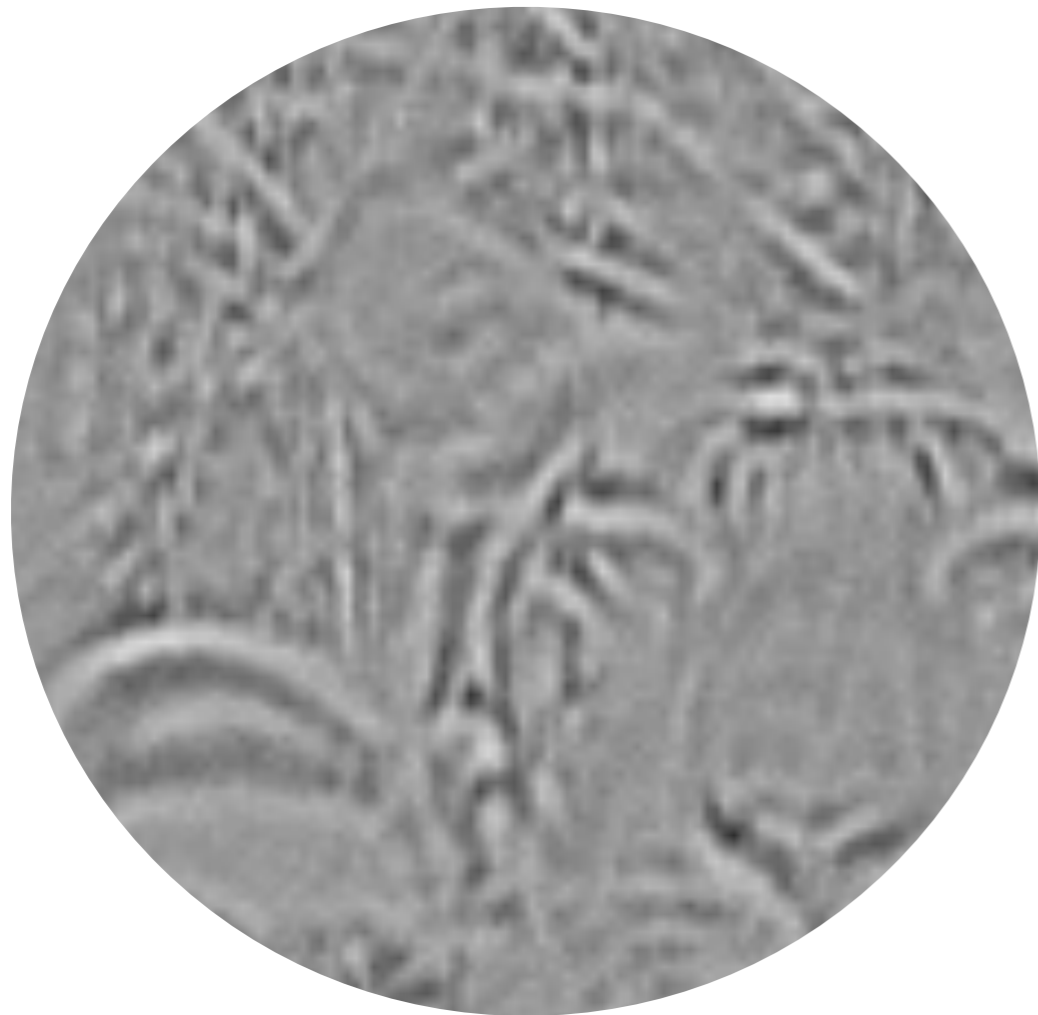
Center-surround receptive fields



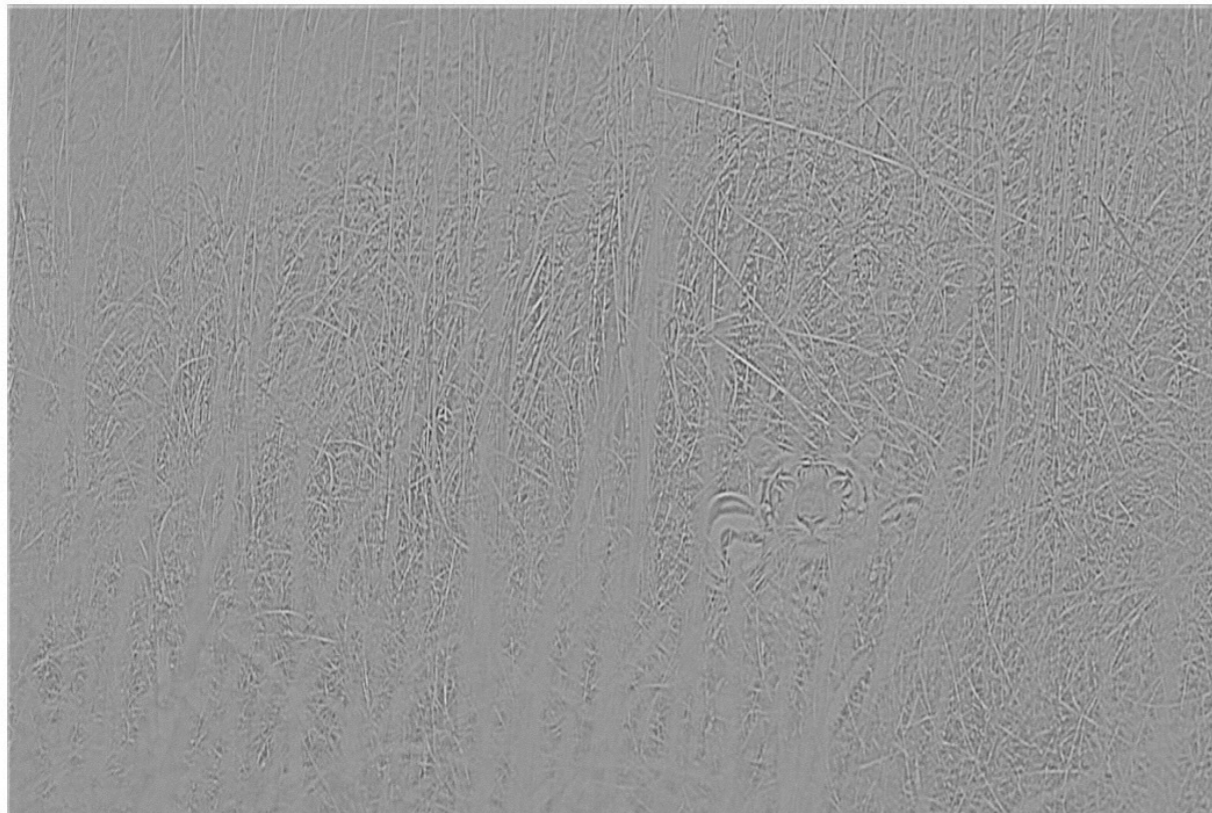
Center-surround receptive fields



Center-surround receptive fields

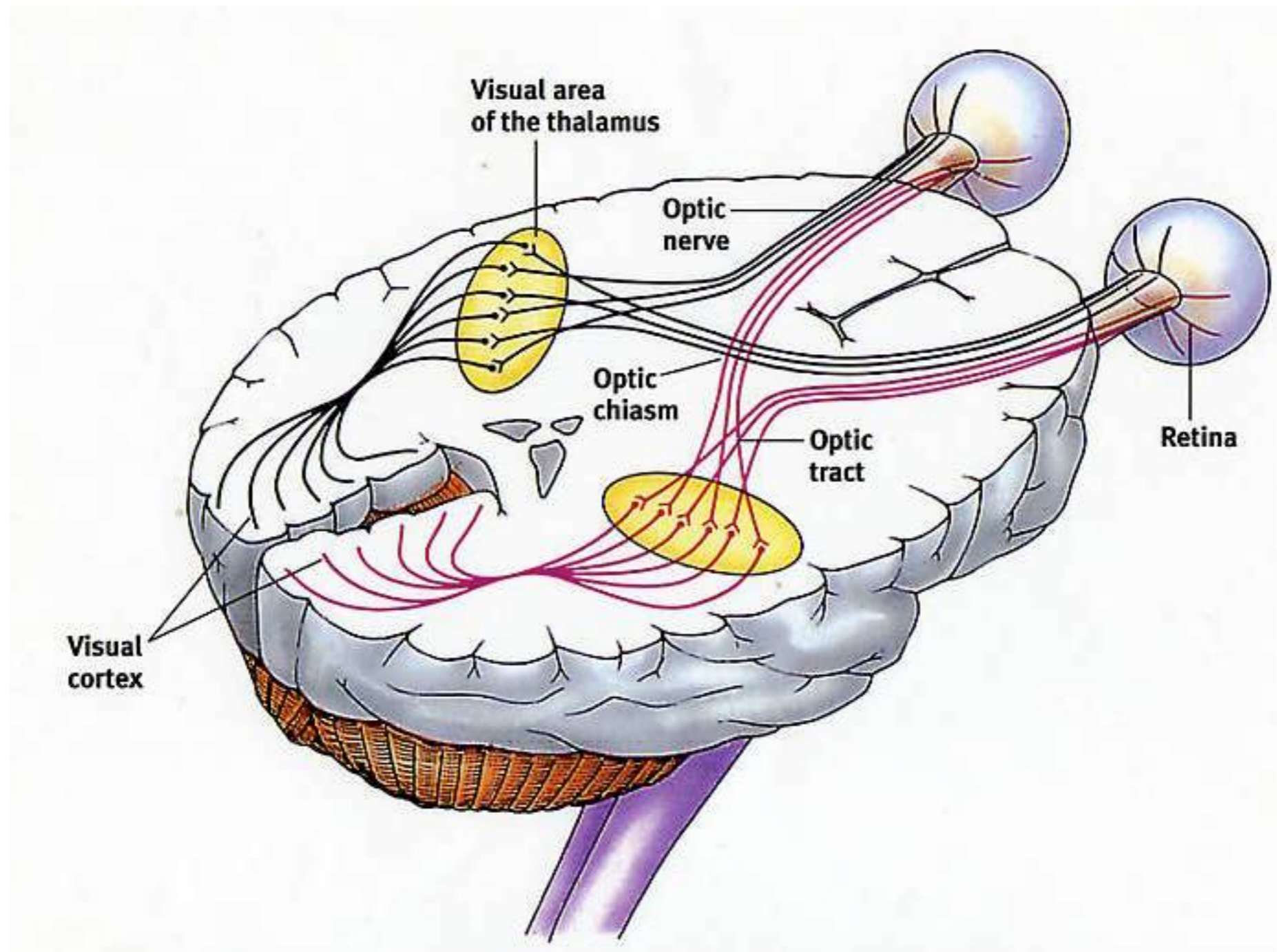


Center-surround receptive fields



Primary visual cortex

Primary visual cortex



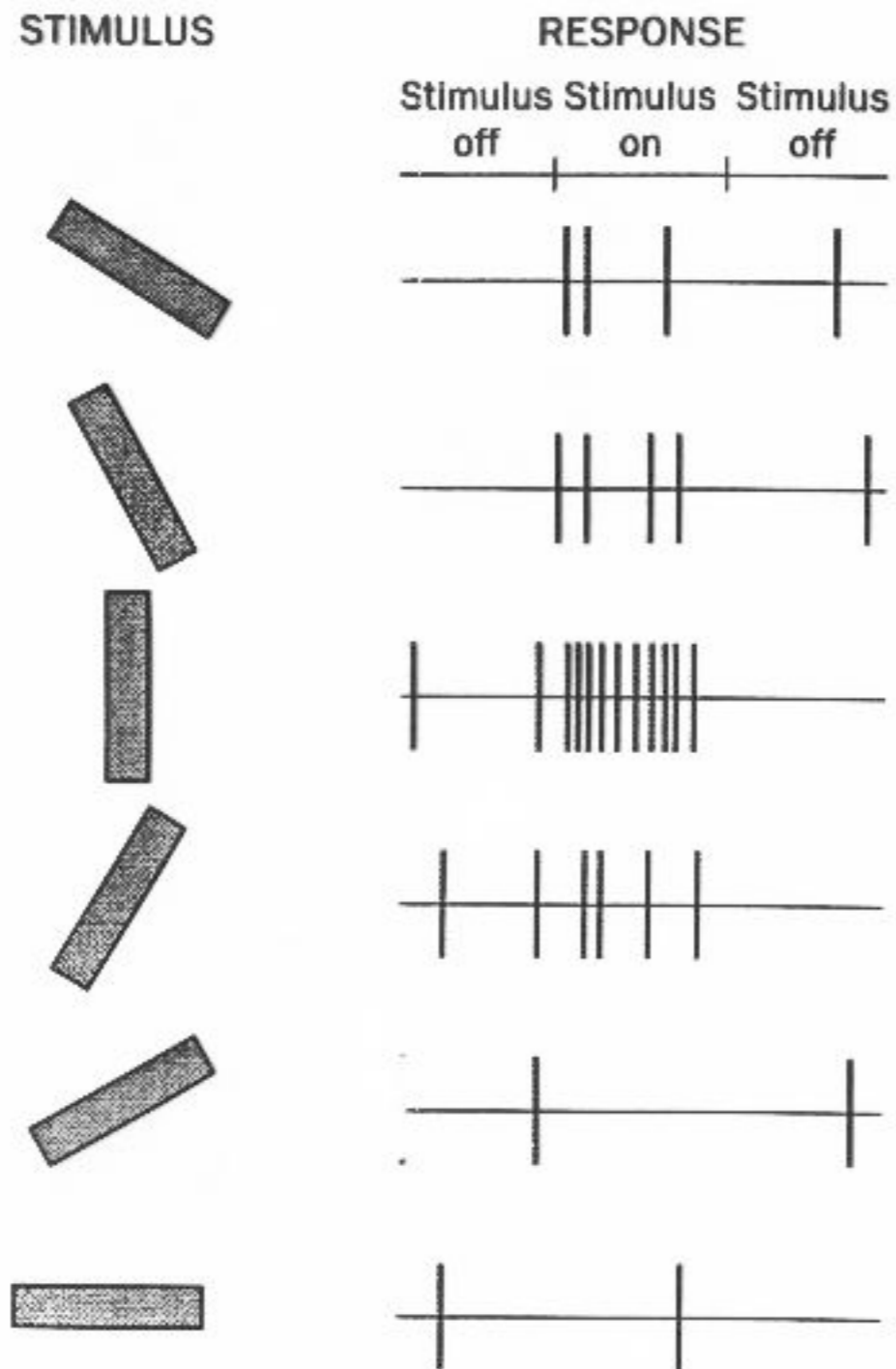
Primary visual cortex

Primary visual cortex

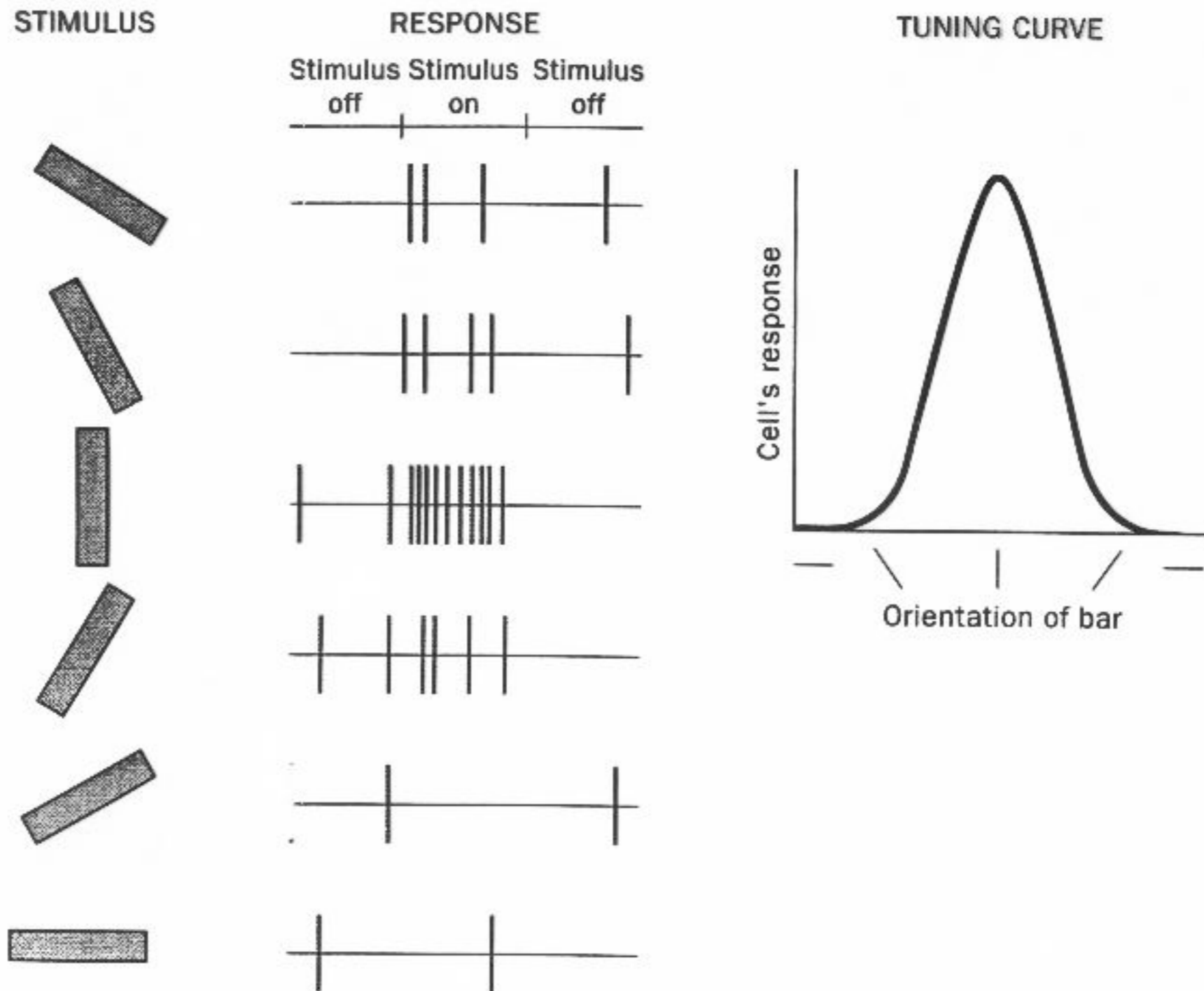
STIMULUS



Primary visual cortex



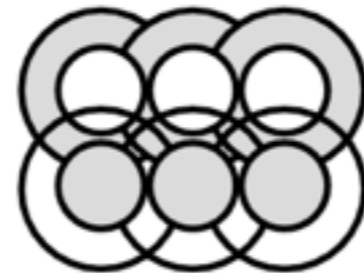
Primary visual cortex



Building orientation selectivity

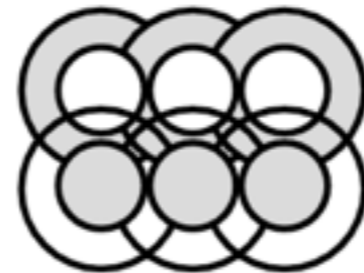
Building orientation selectivity

Center-surround
receptive fields

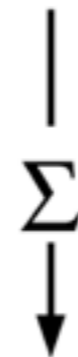


Building orientation selectivity

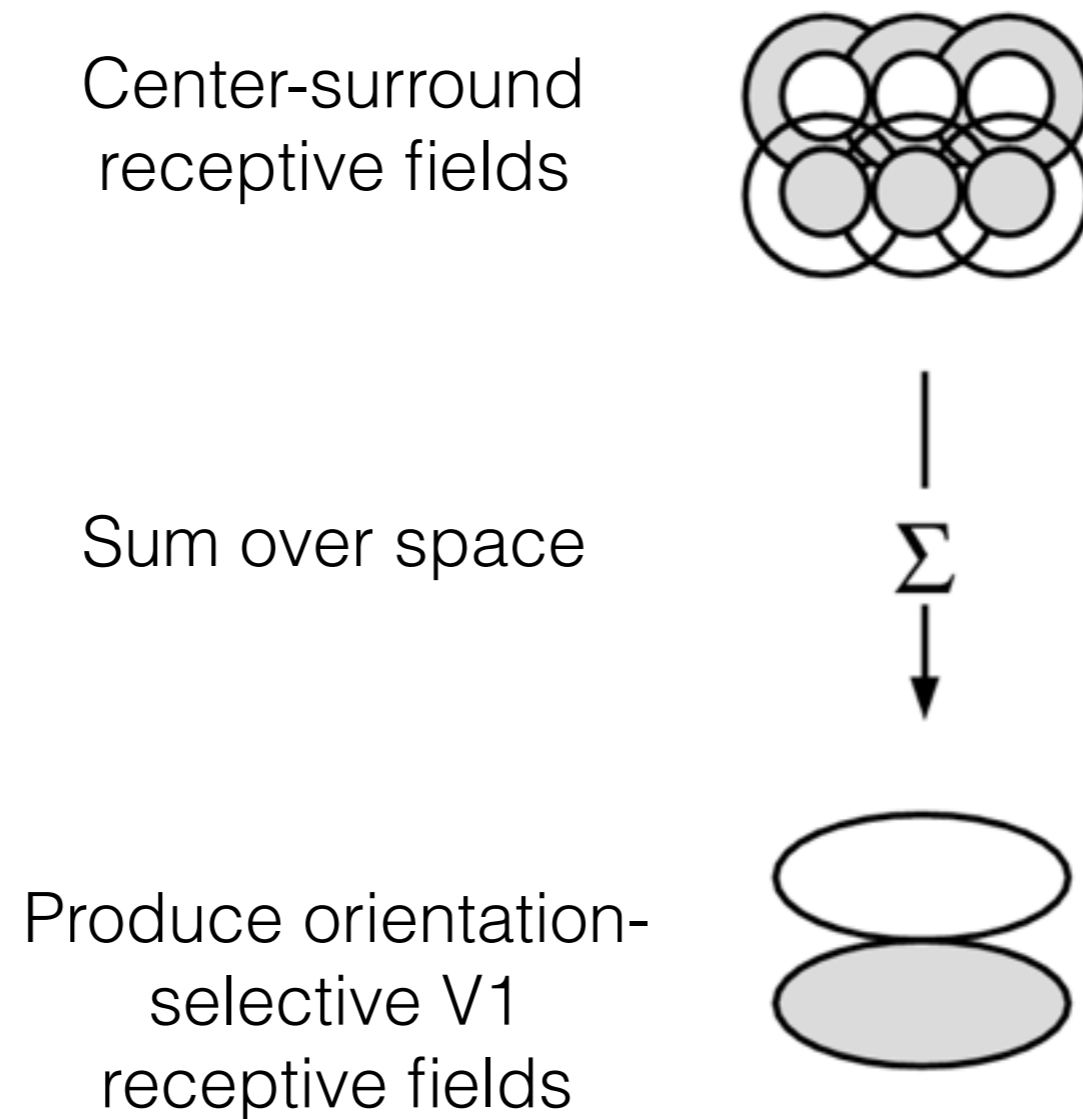
Center-surround
receptive fields



Sum over space



Building orientation selectivity

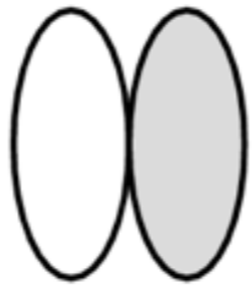


Why orientation selectivity?

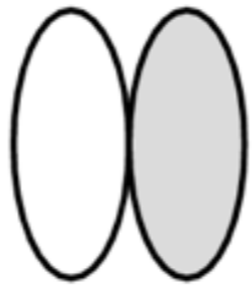
Why orientation selectivity?



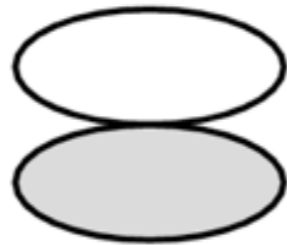
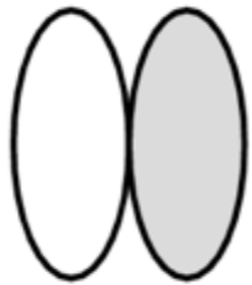
Why orientation selectivity?



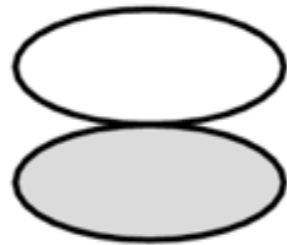
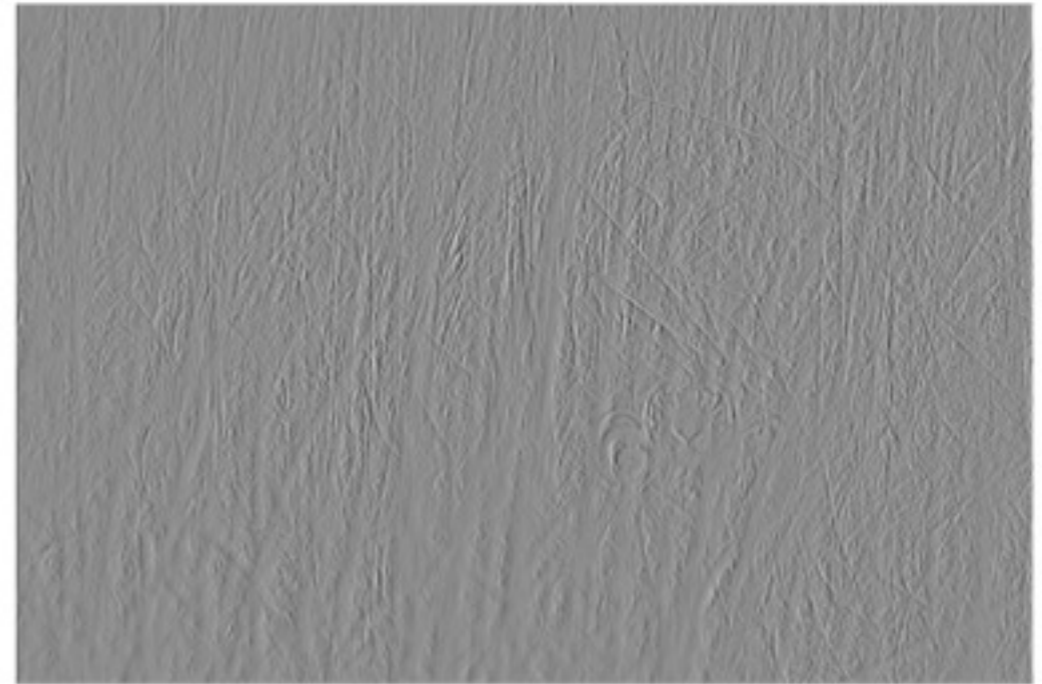
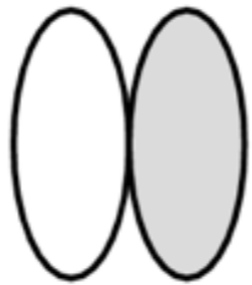
Why orientation selectivity?



Why orientation selectivity?



Why orientation selectivity?



Why orientation selectivity?

Why orientation selectivity?

Signal *differences* in light

Why orientation selectivity?

~~—Signal *differences* in light—~~

Why orientation selectivity?

~~—Signal *differences* in light—~~

Edge detectors

Why orientation selectivity?

~~— Signal *differences* in light —~~

~~— Edge detectors —~~

Why orientation selectivity?

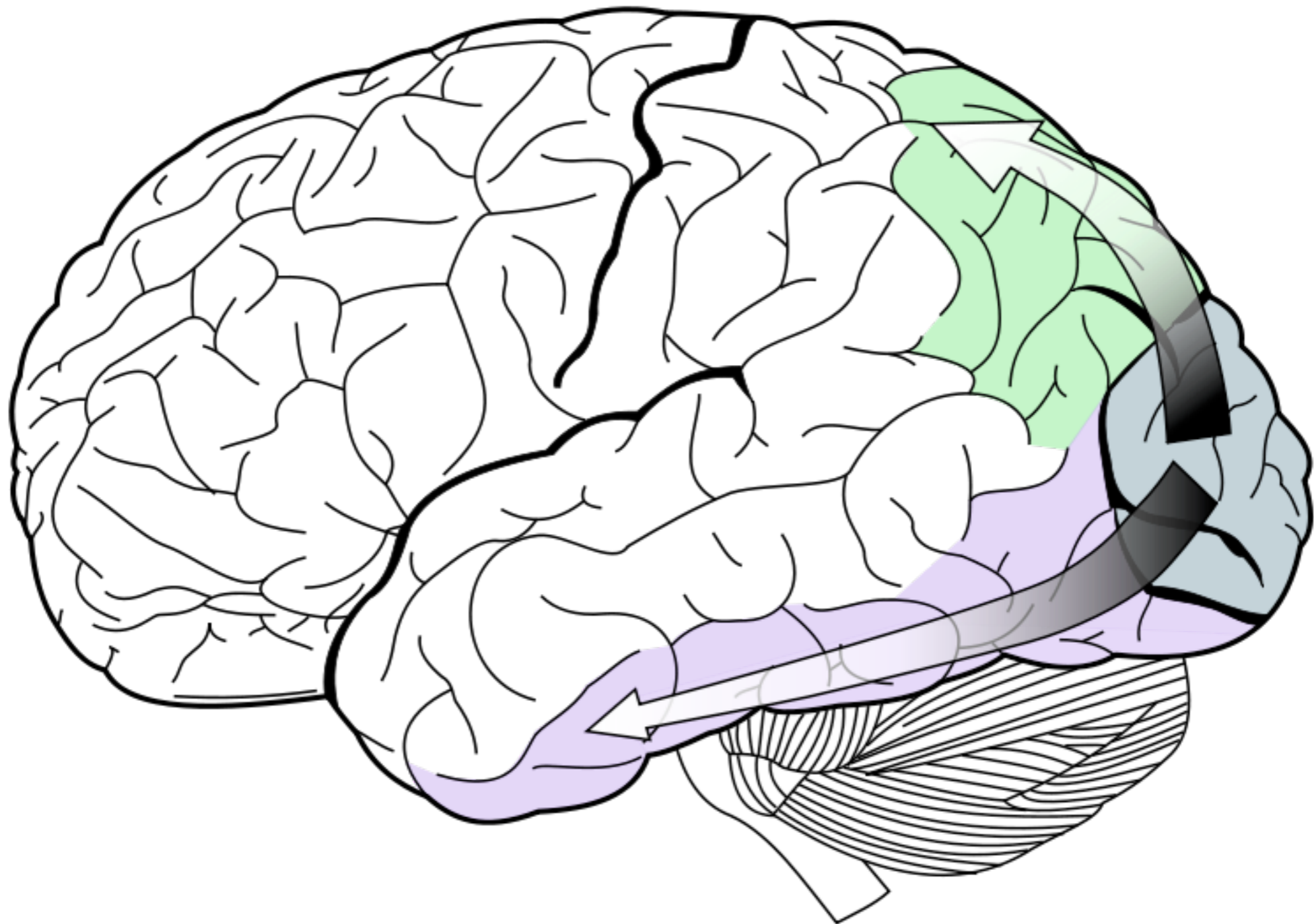
~~— Signal *differences* in light —~~

~~— Edge detectors —~~

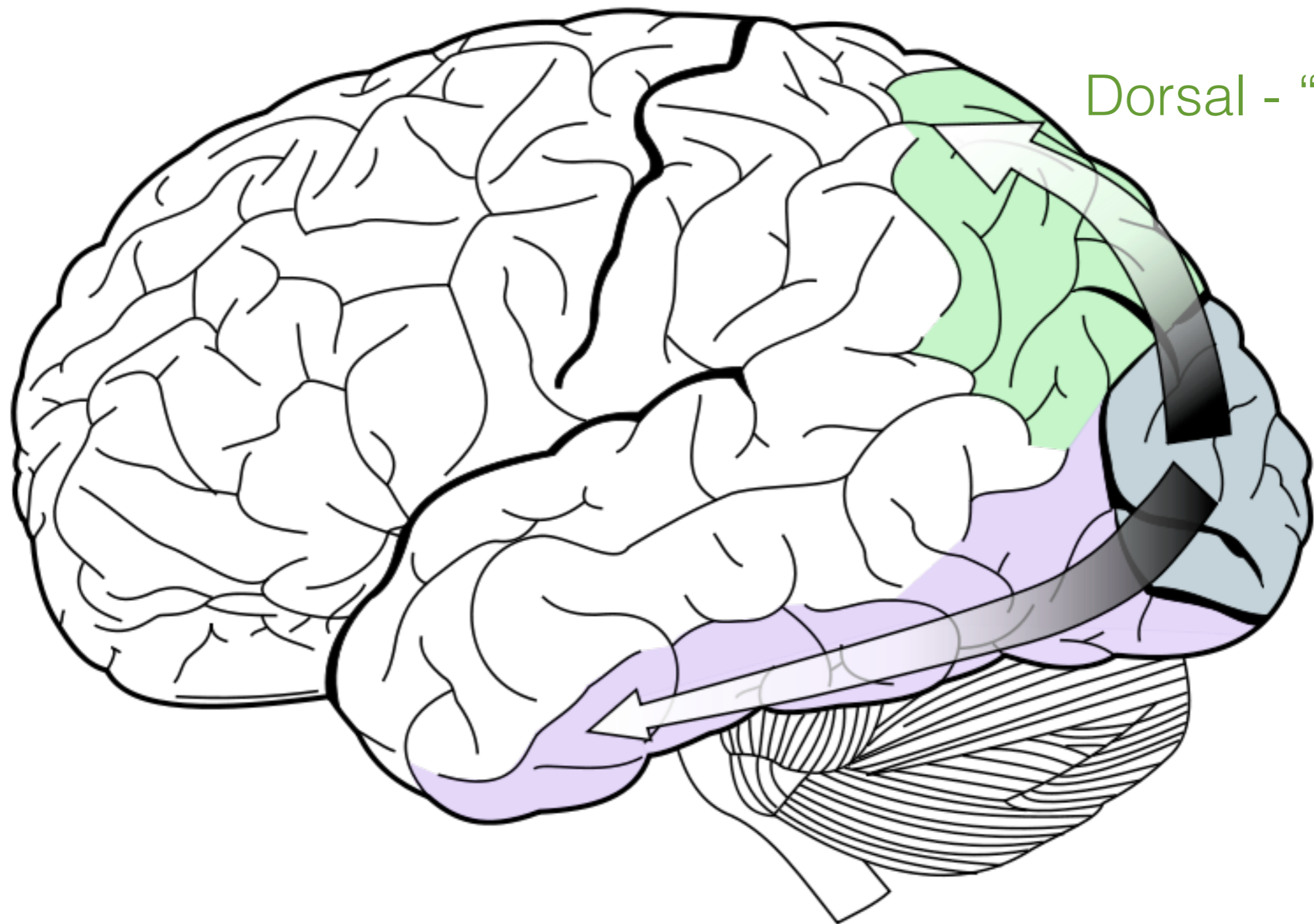
Oriented edge detectors

What to do with all that information?

What to do with all that information?

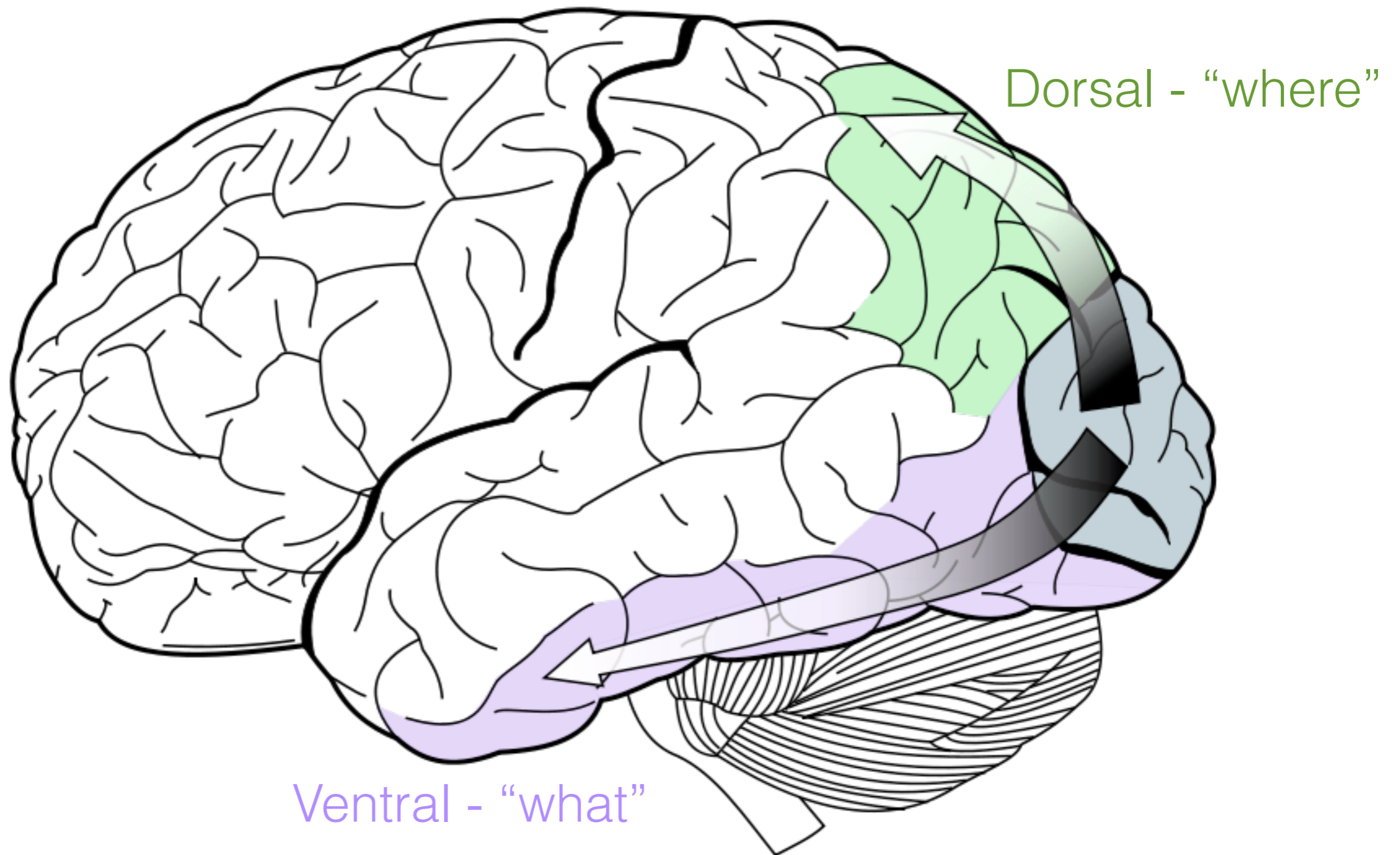


What to do with all that information?



Dorsal - "where"

What to do with all that information?



Dorsal visual pathway

Dorsal visual pathway

Area MT



Dorsal visual pathway

Area MT



- Large visual fields

Dorsal visual pathway

Area MT



- Large visual fields
- Responds to moving objects

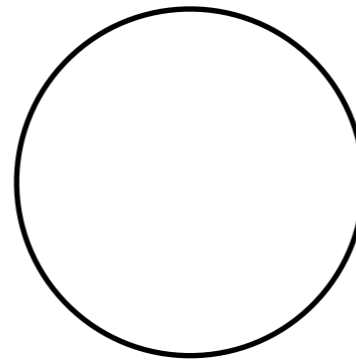
Dorsal visual pathway

Area MT



- Large visual fields
- Responds to moving objects

Stimulus



MT response



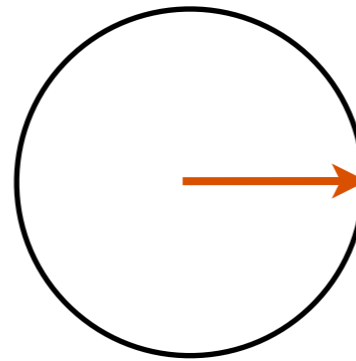
Dorsal visual pathway

Area MT



- Large visual fields
- Responds to moving objects

Stimulus



MT response



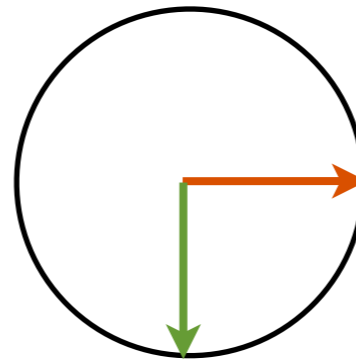
Dorsal visual pathway

Area MT

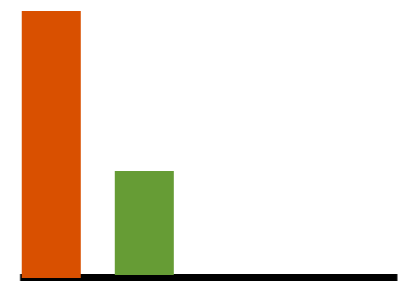


- Large visual fields
- Responds to moving objects

Stimulus

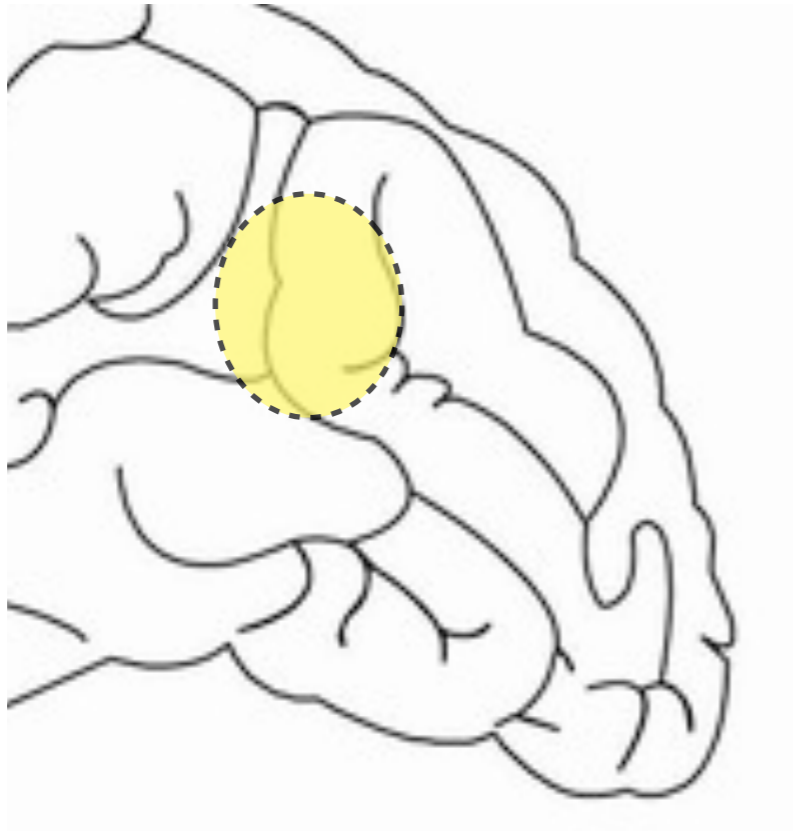


MT response



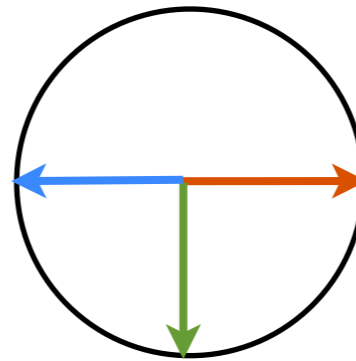
Dorsal visual pathway

Area MT

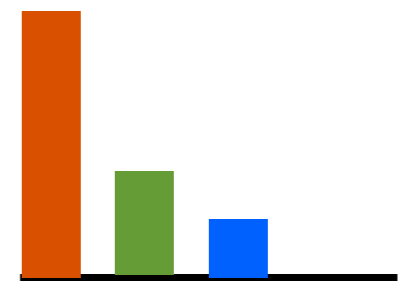


- Large visual fields
- Responds to moving objects

Stimulus



MT response



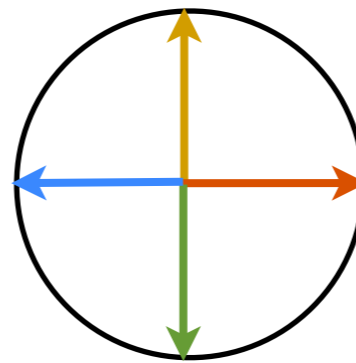
Dorsal visual pathway

Area MT

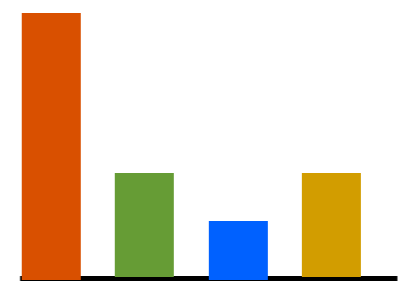


- Large visual fields
- Responds to moving objects

Stimulus



MT response



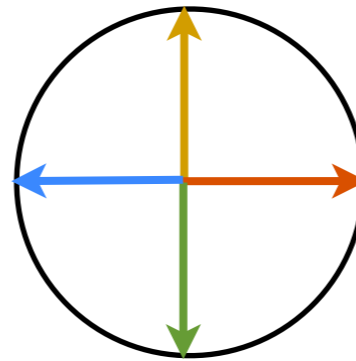
Dorsal visual pathway

Area MT

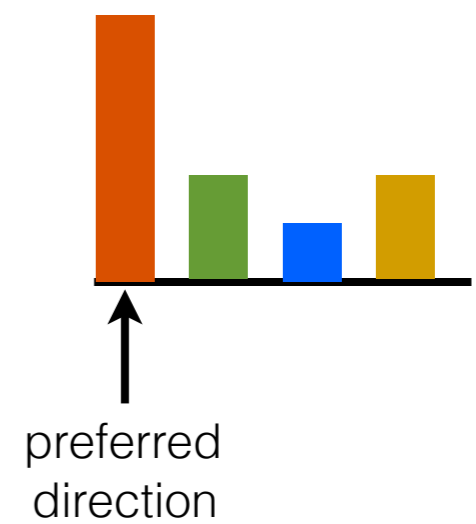


- Large visual fields
- Responds to moving objects

Stimulus



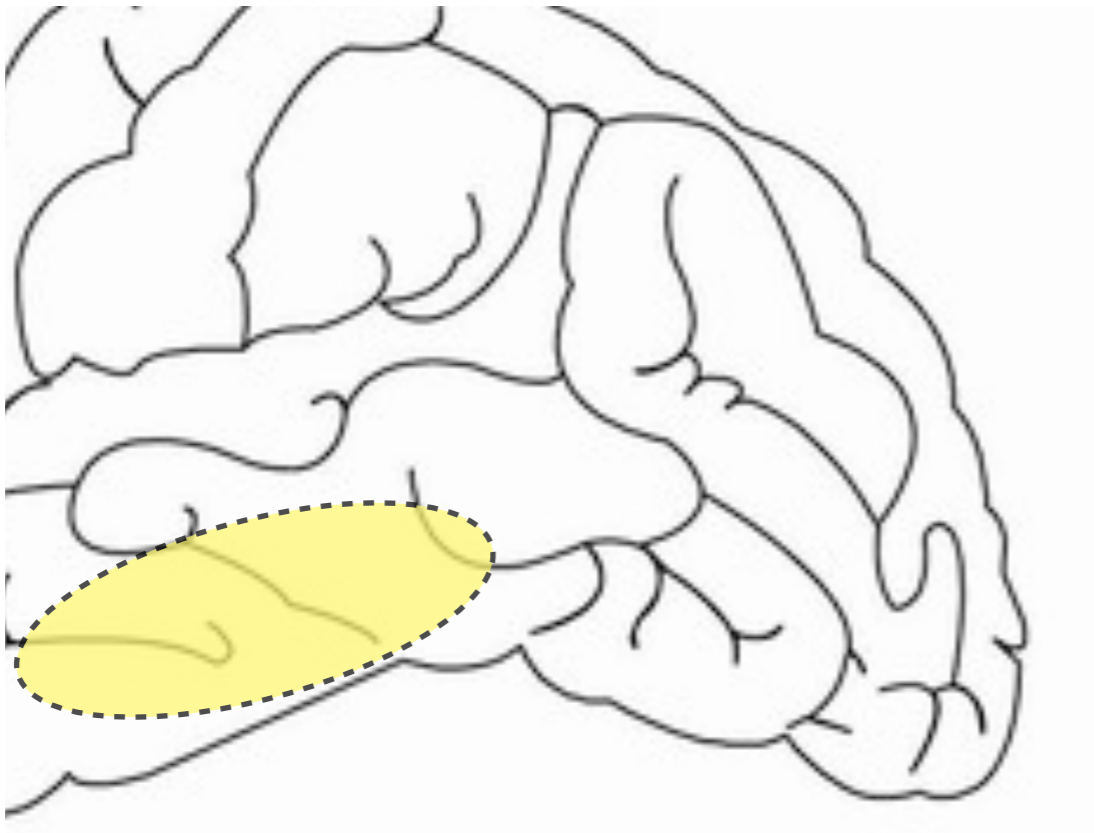
MT response



Ventral visual pathway

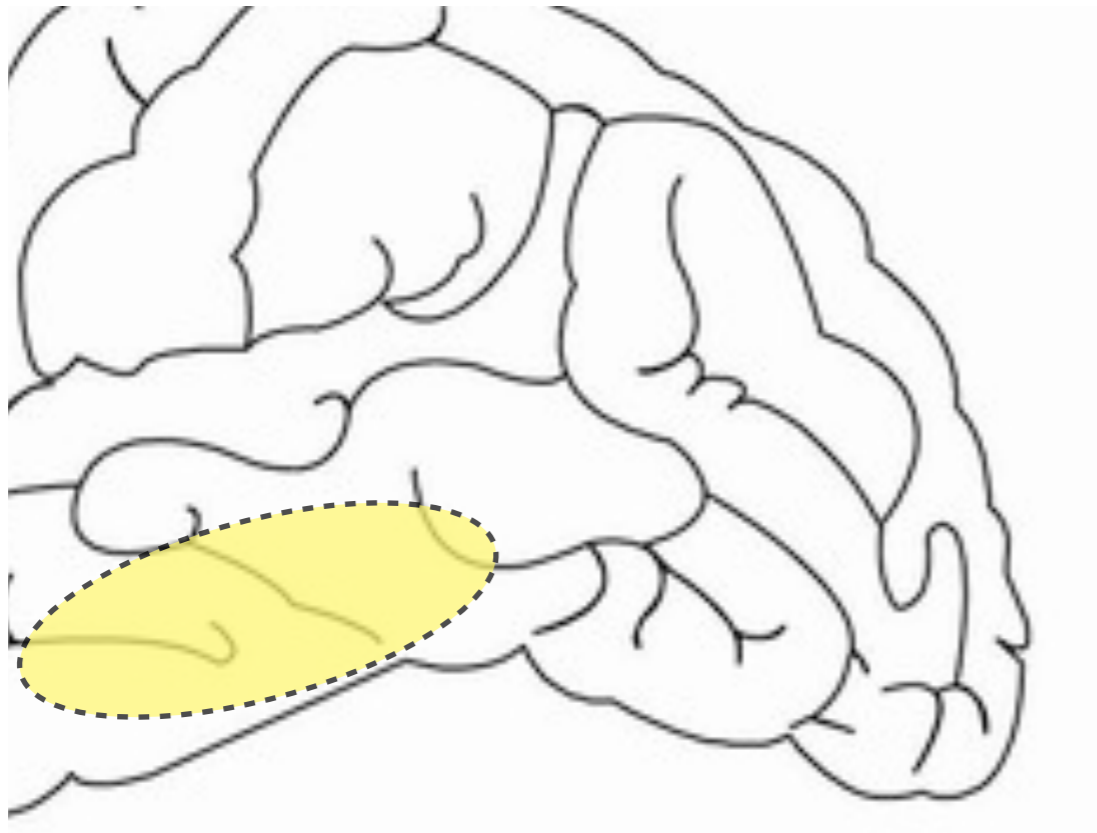
Ventral visual pathway

Inferior temporal cortex



Ventral visual pathway

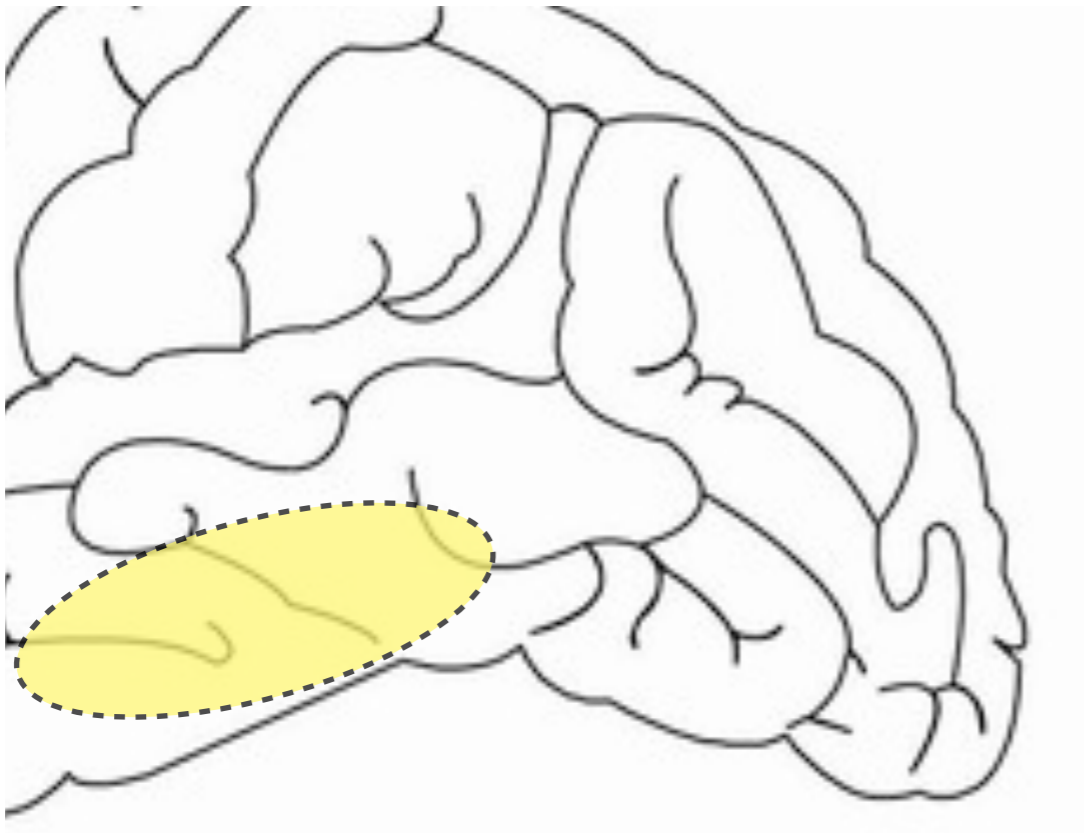
Inferior temporal cortex



- Large visual fields

Ventral visual pathway

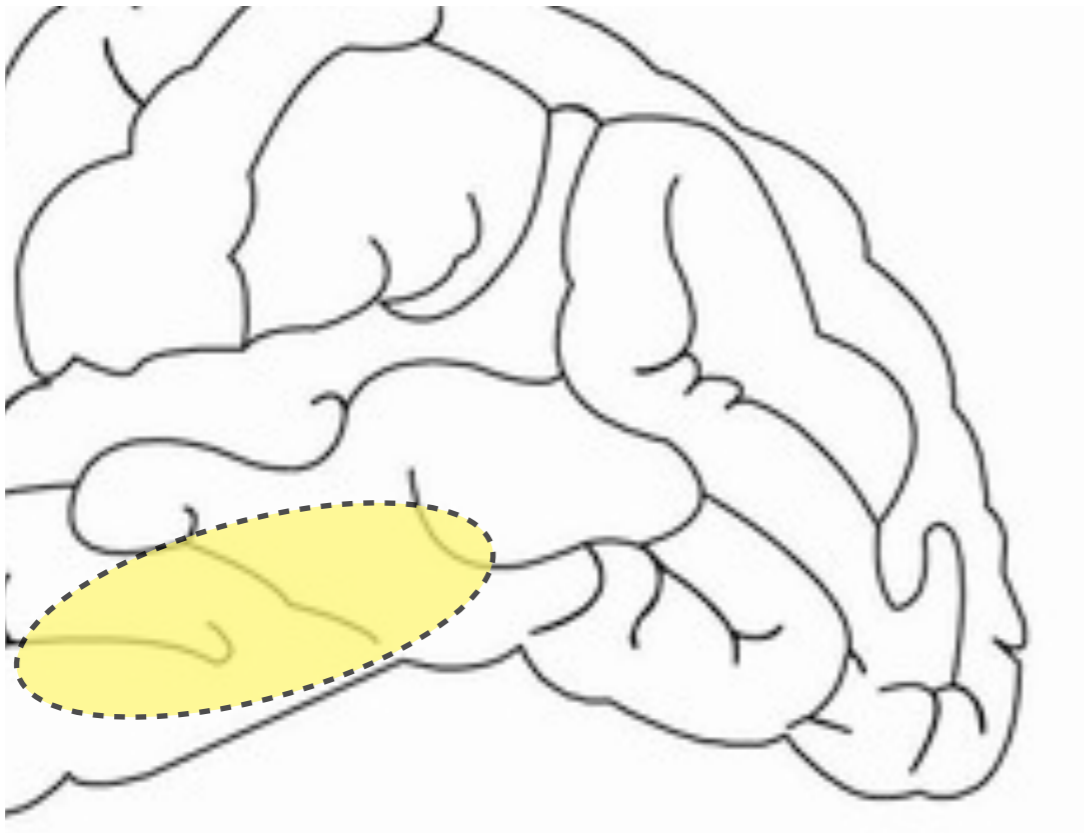
Inferior temporal cortex



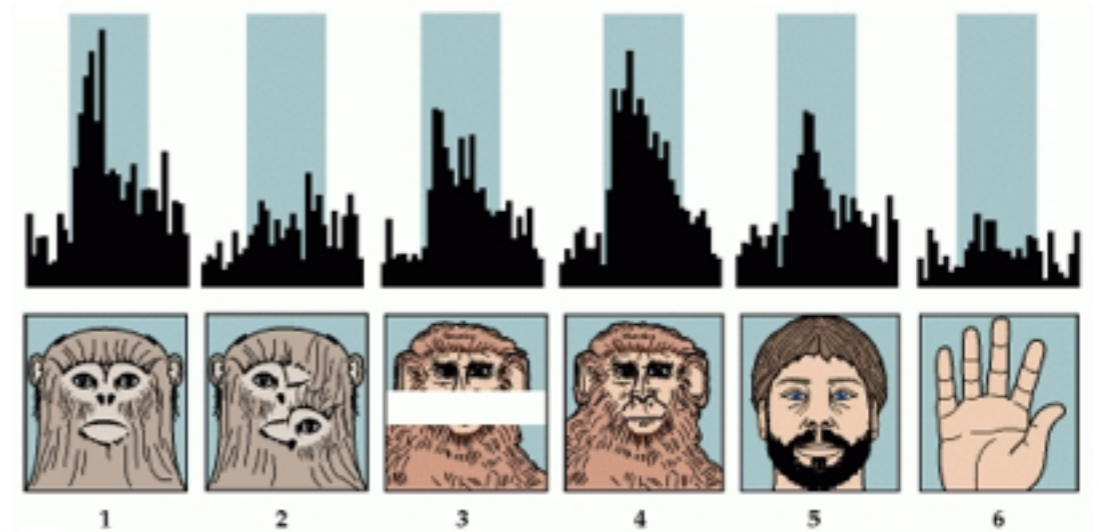
- Large visual fields
- Responds to complex visual objects

Ventral visual pathway

Inferior temporal cortex

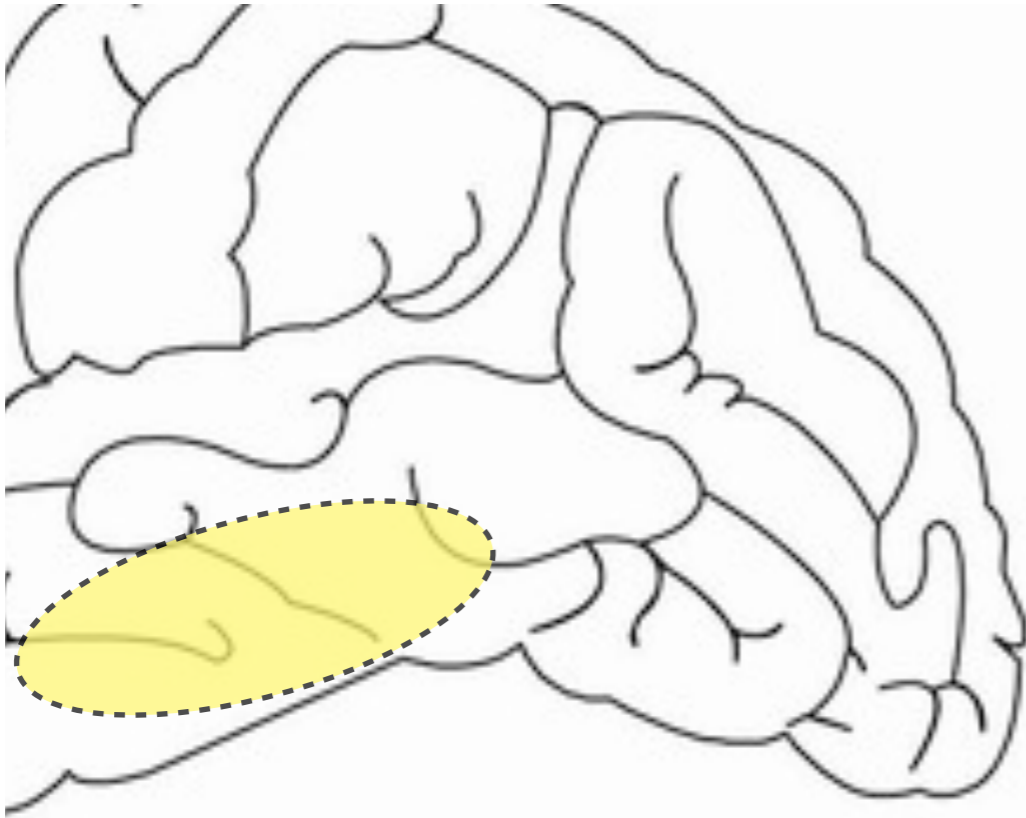


- Large visual fields
- Responds to complex visual objects

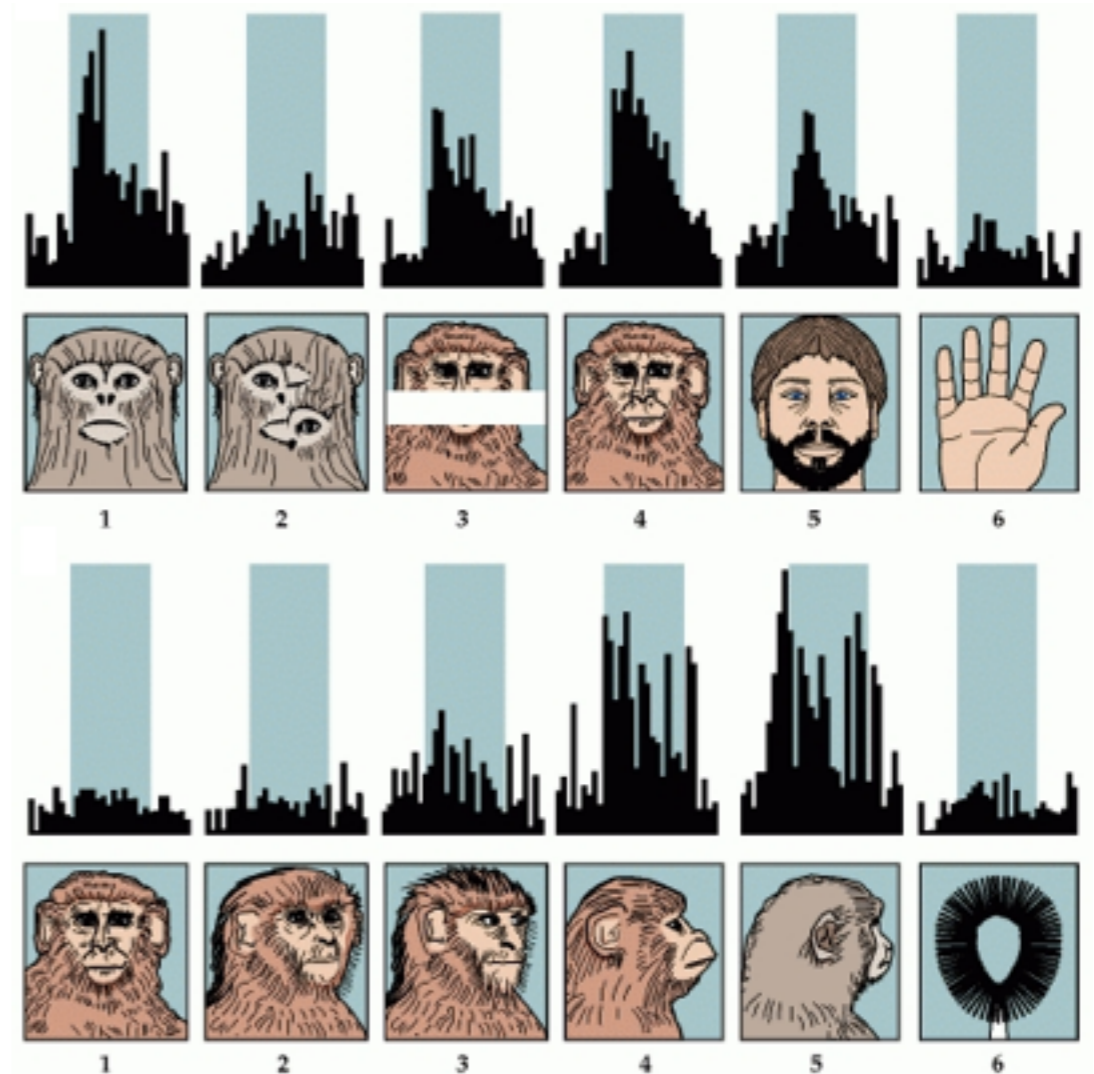


Ventral visual pathway

Inferior temporal cortex

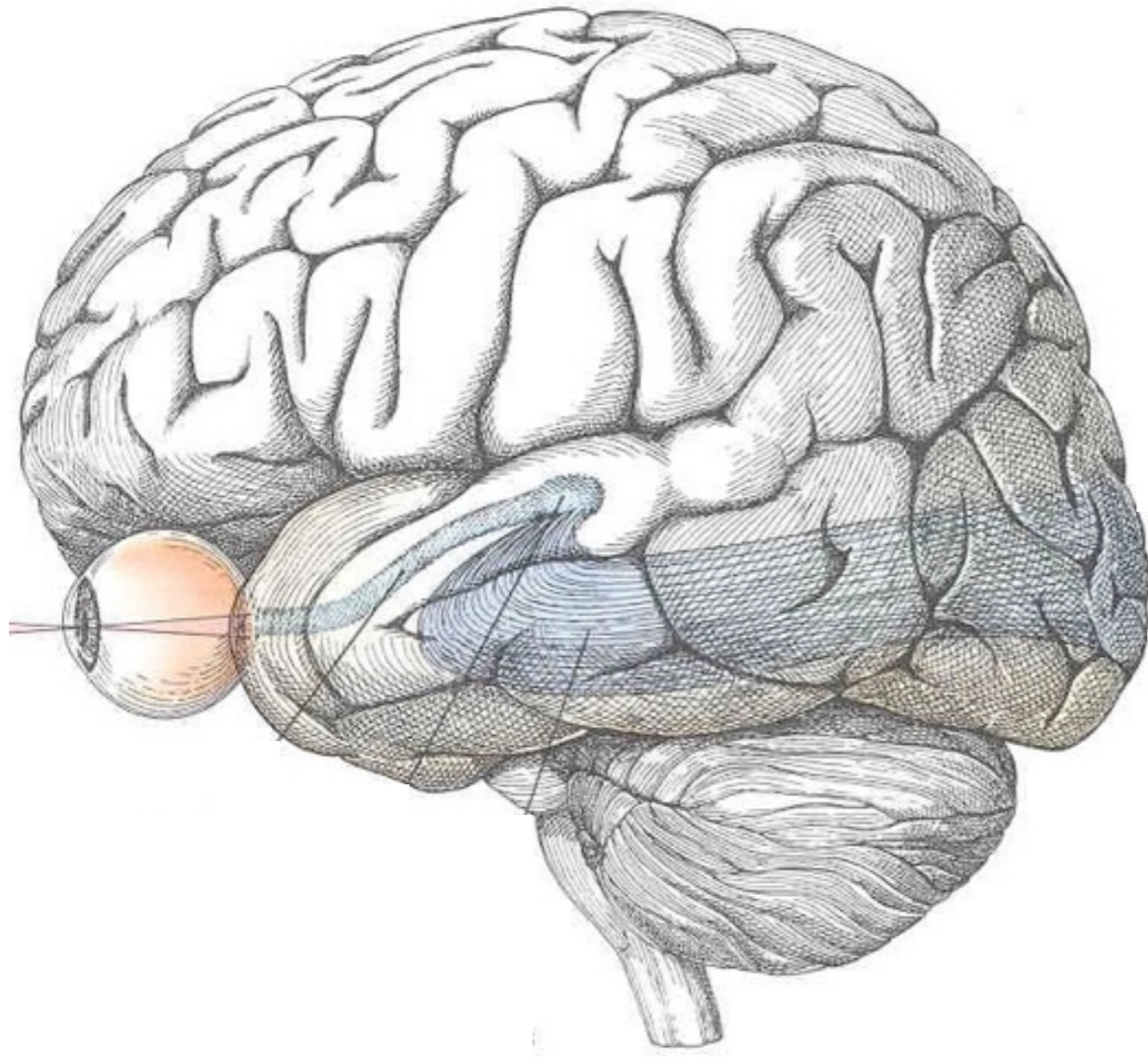


- Large visual fields
- Responds to complex visual objects

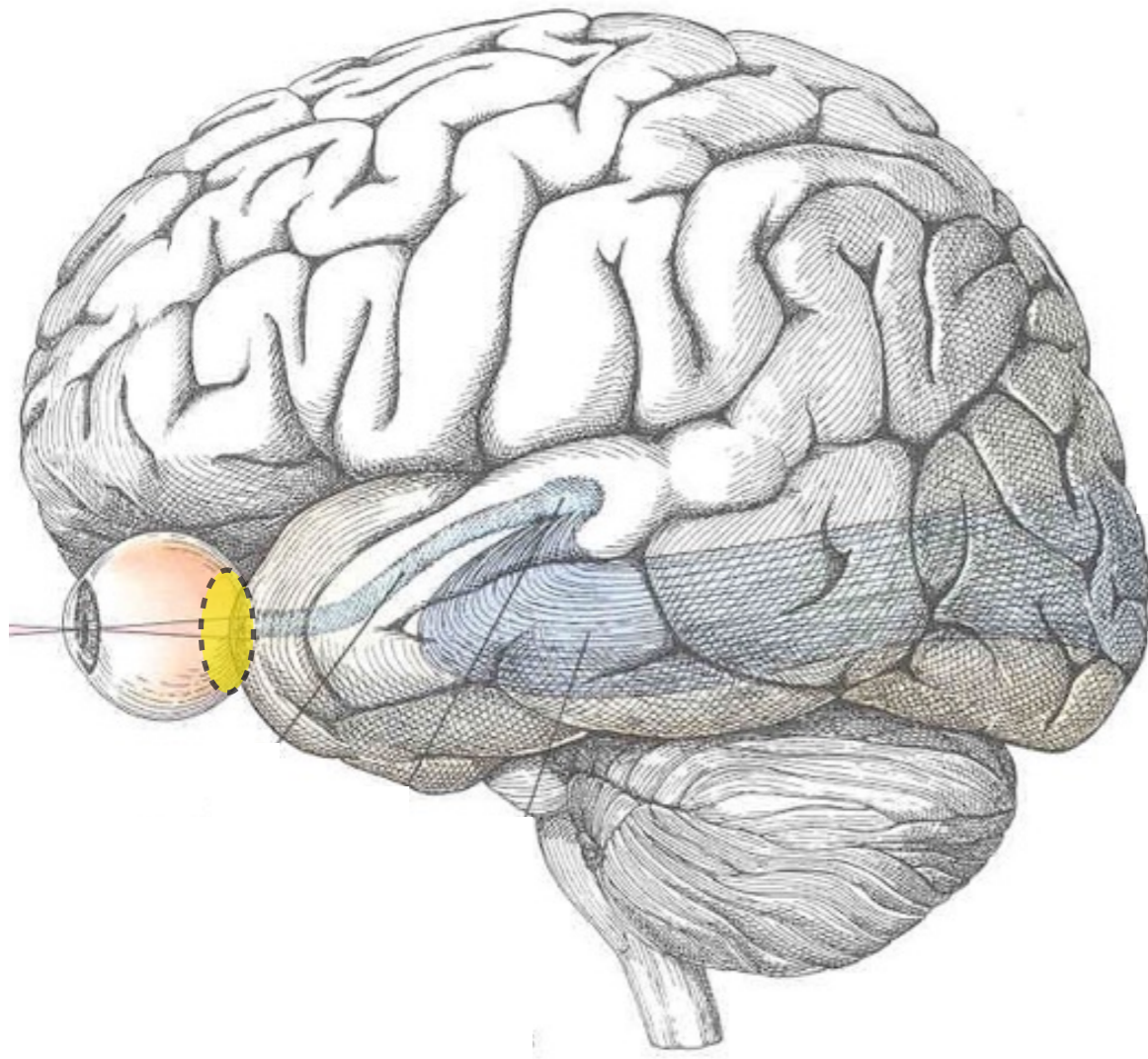


Building complex from simple

Building complex from simple

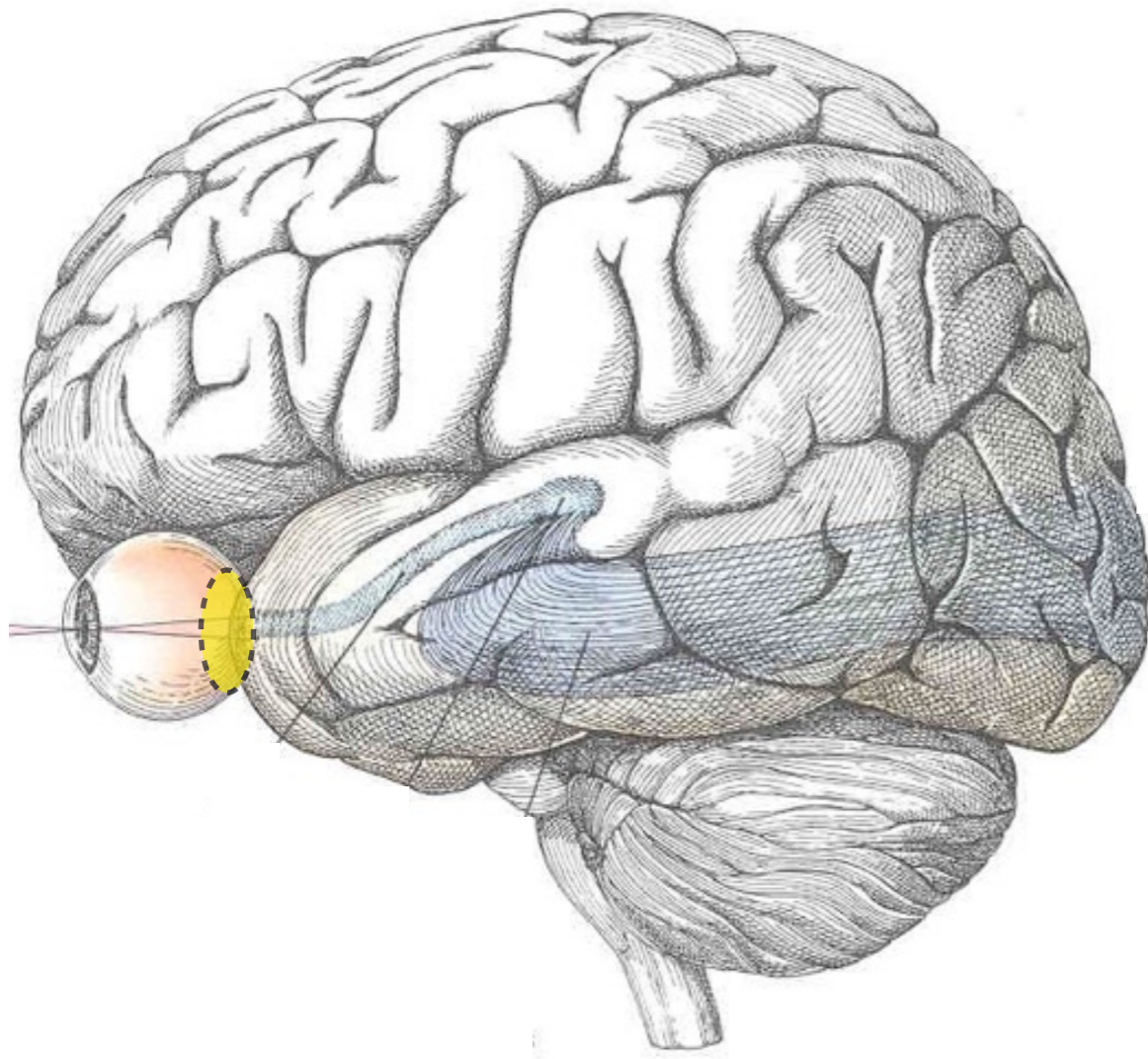


Building complex from simple



Retina

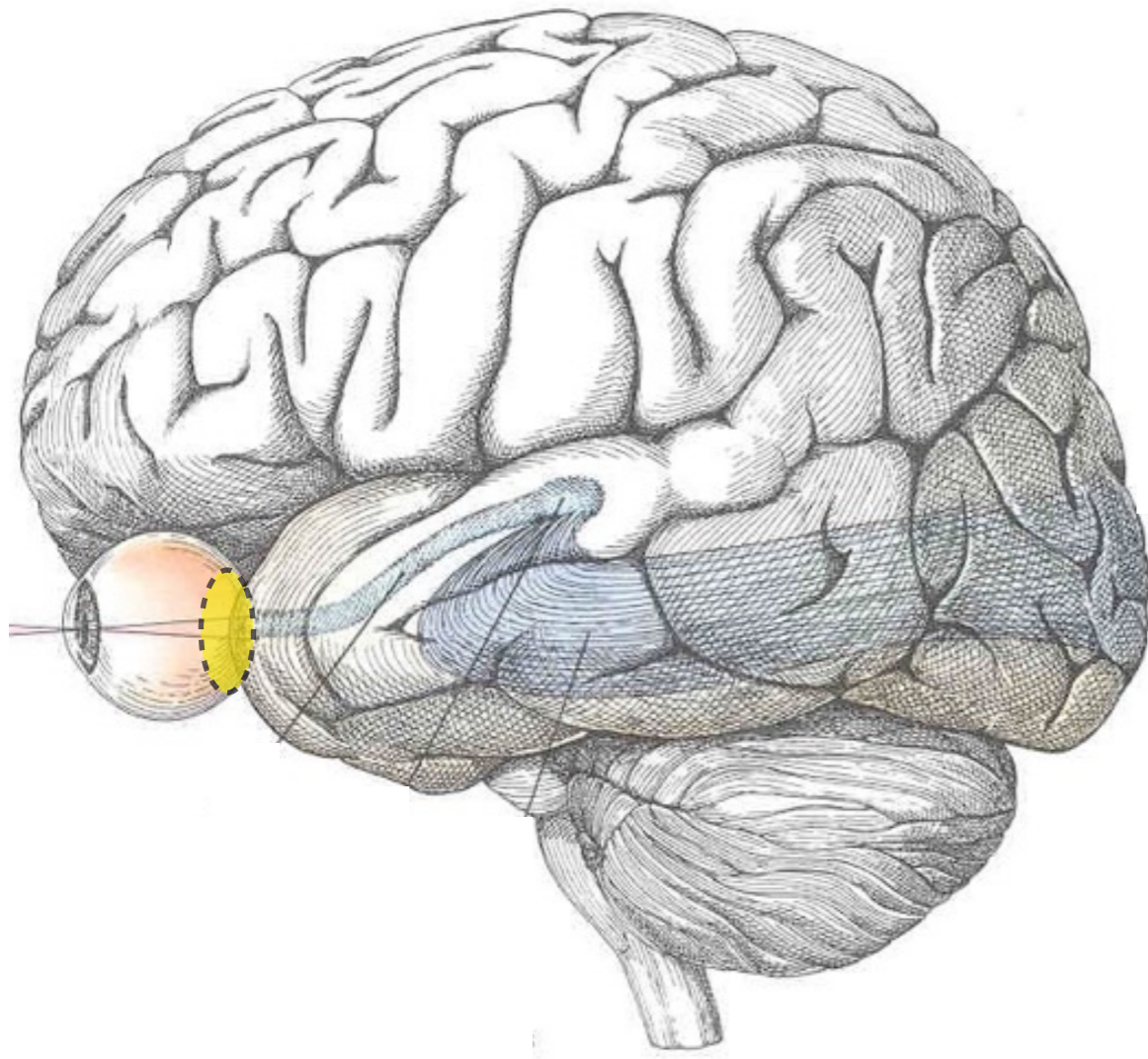
Building complex from simple



Retina

- Center-surround fields

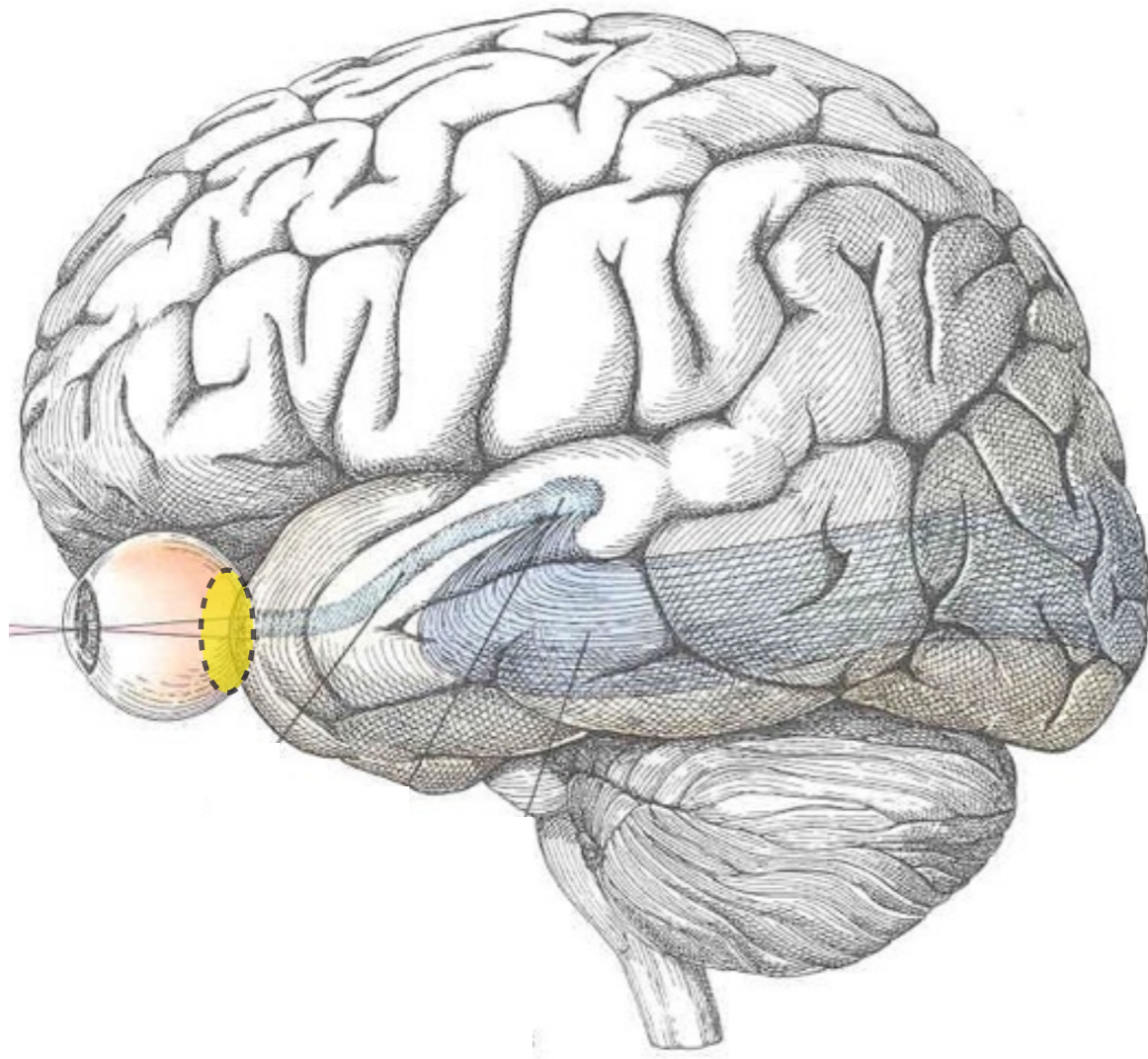
Building complex from simple



Retina

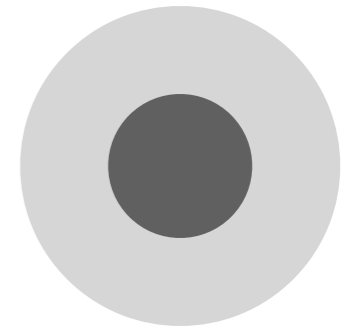
- Center-surround fields
- Contrast in space and time

Building complex from simple

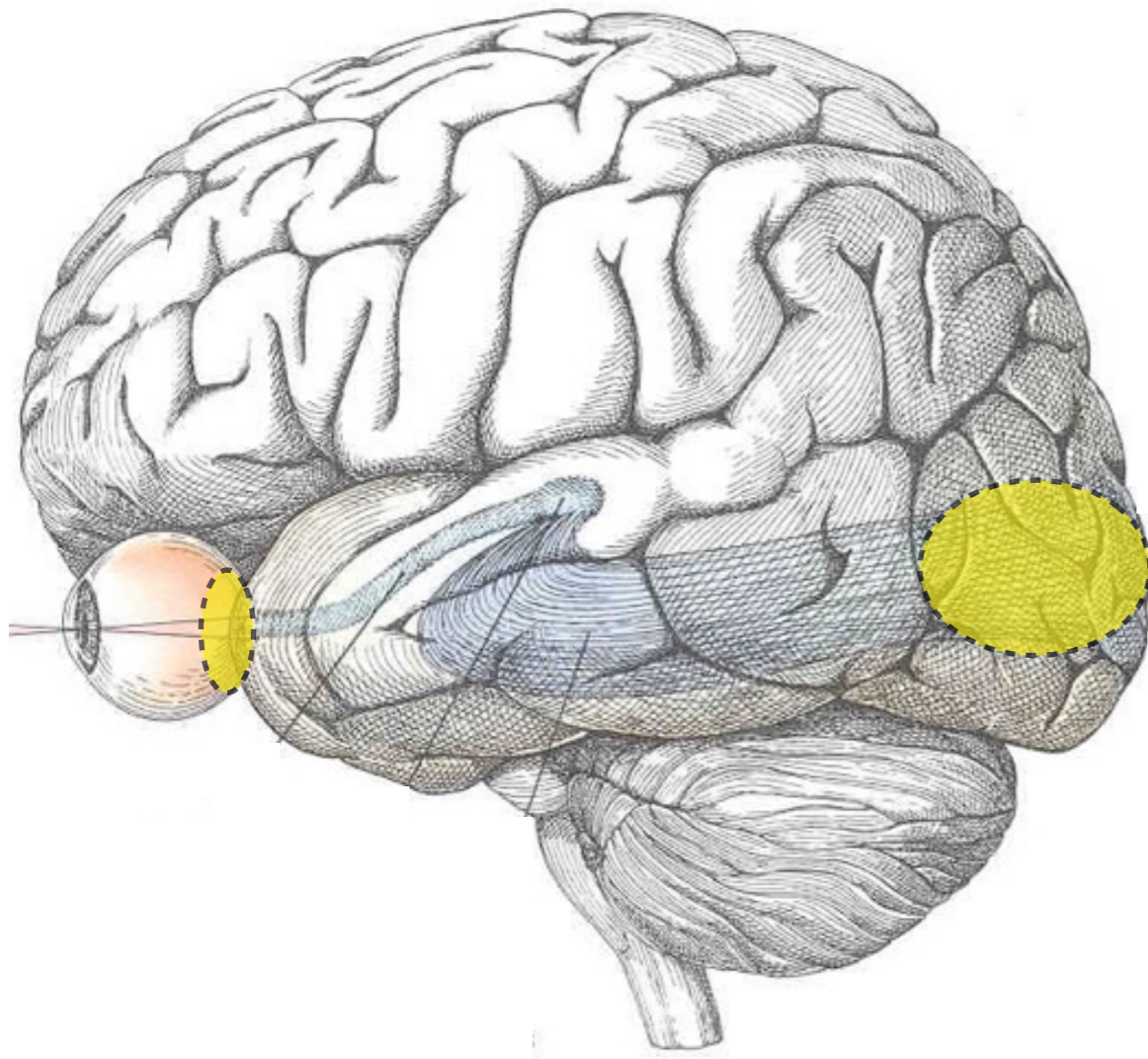


Retina

- Center-surround fields
- Contrast in space and time

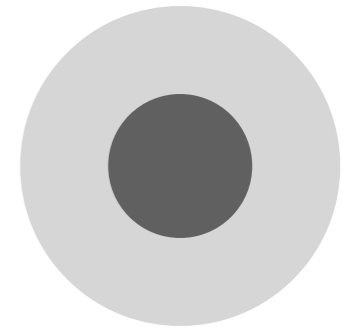


Building complex from simple



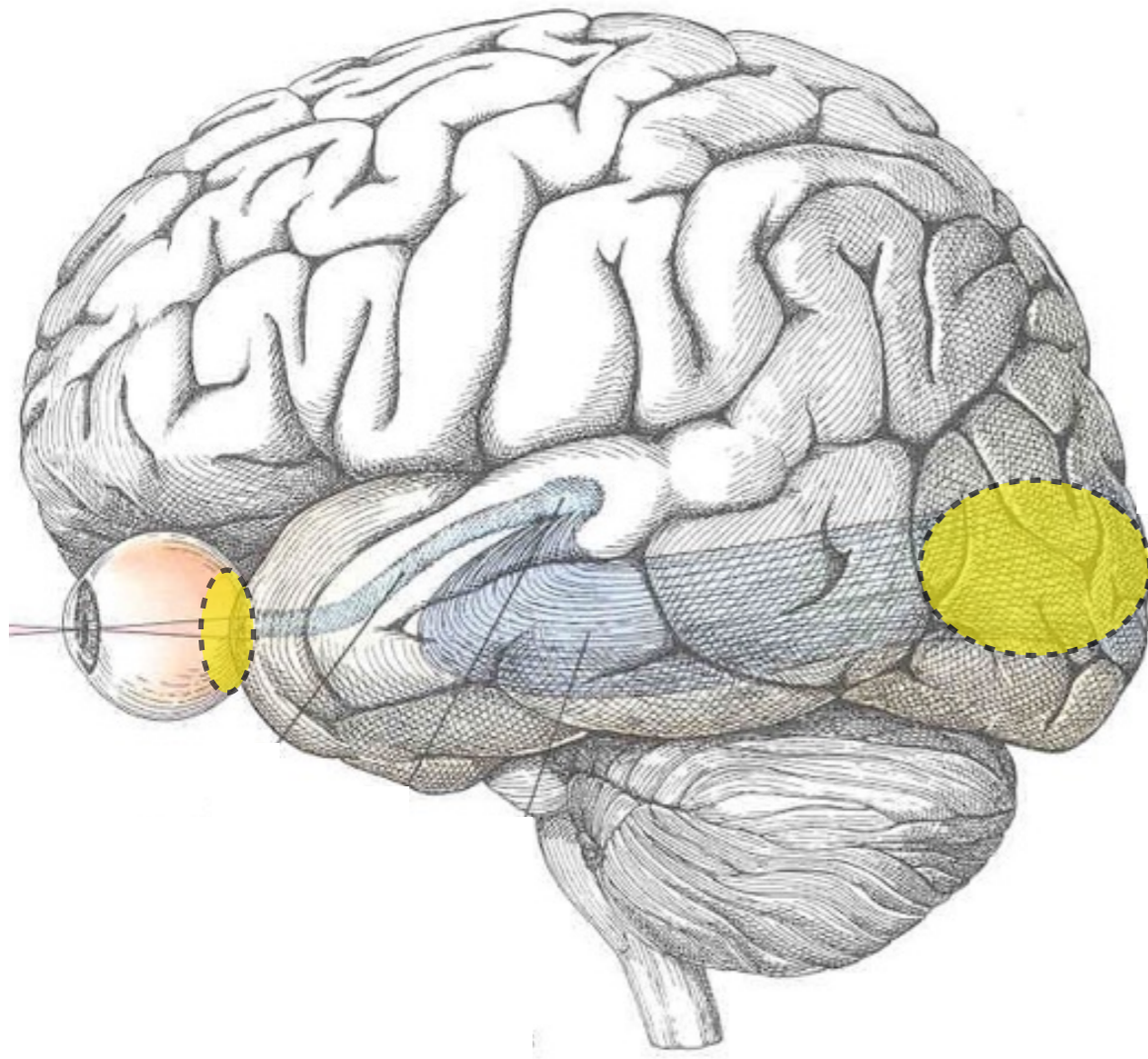
Retina

- Center-surround fields
- Contrast in space and time



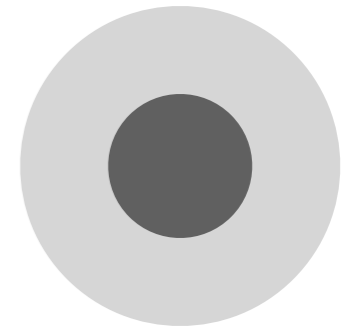
V1

Building complex from simple



Retina

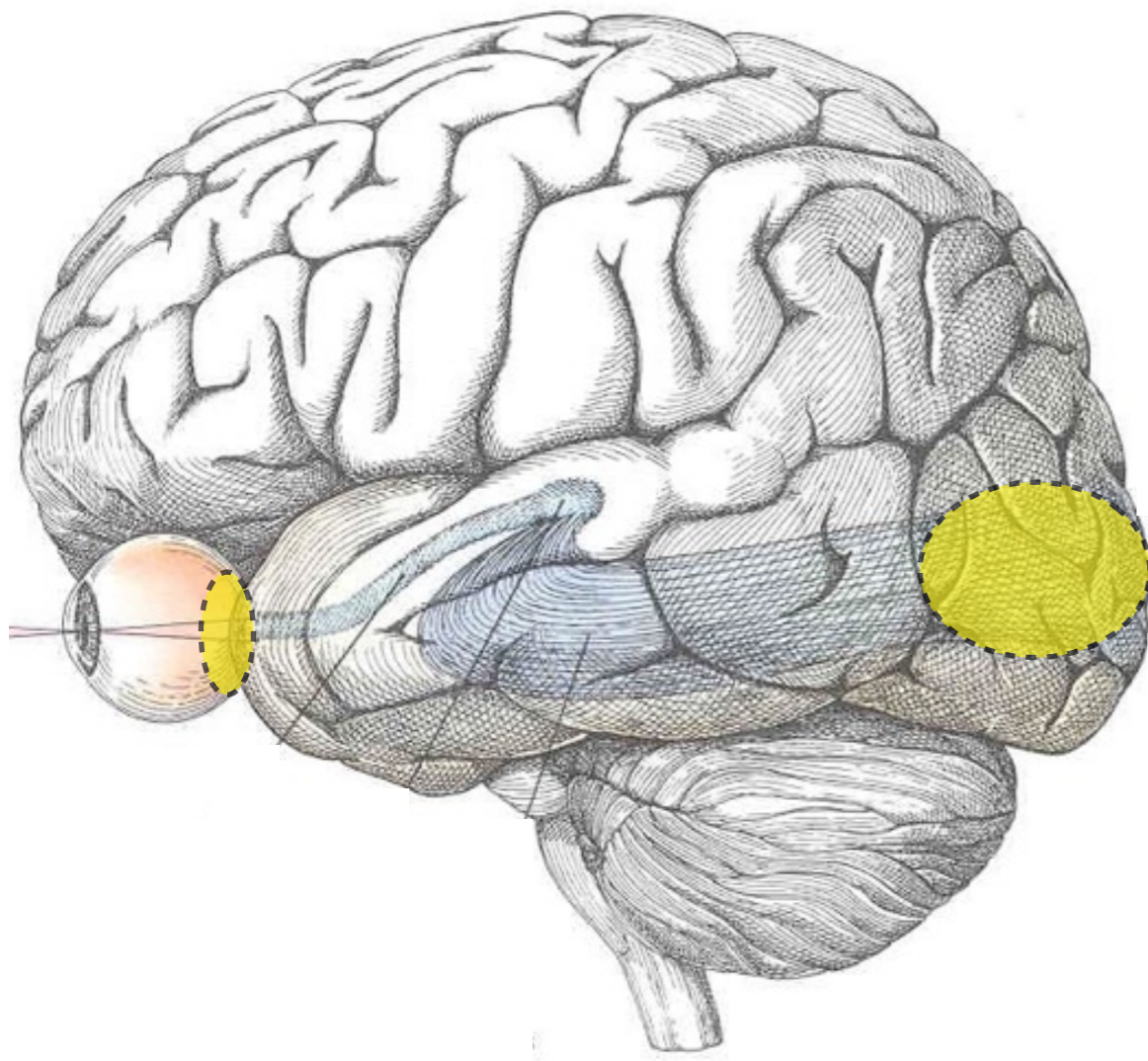
- Center-surround fields
- Contrast in space and time



V1

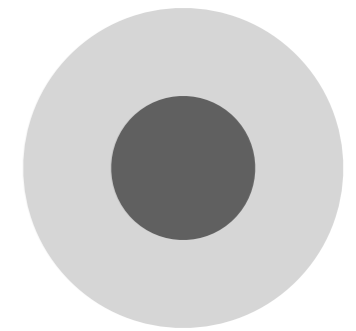
- Simple visual features

Building complex from simple



Retina

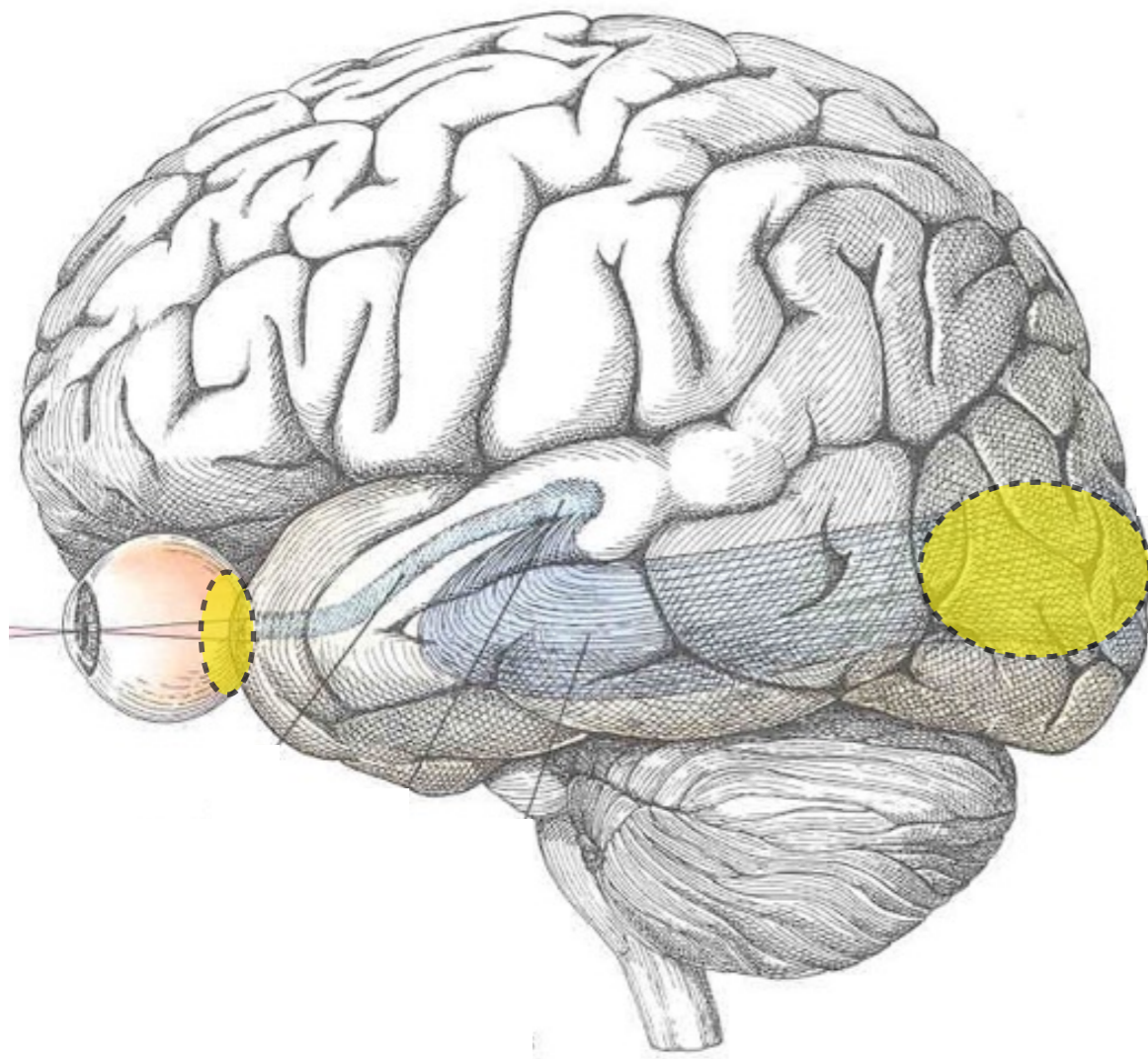
- Center-surround fields
- Contrast in space and time



V1

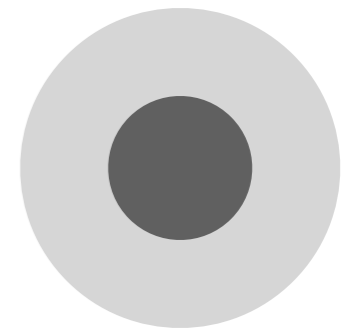
- Simple visual features
- Orientation tuning

Building complex from simple



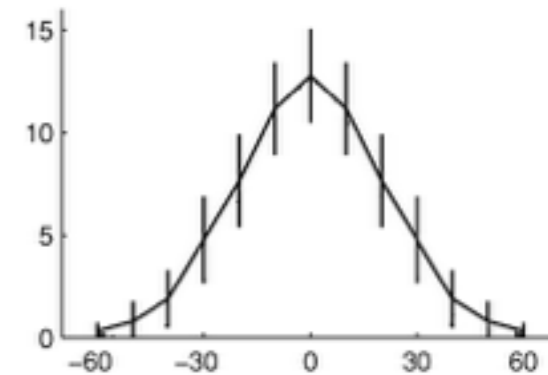
Retina

- Center-surround fields
- Contrast in space and time

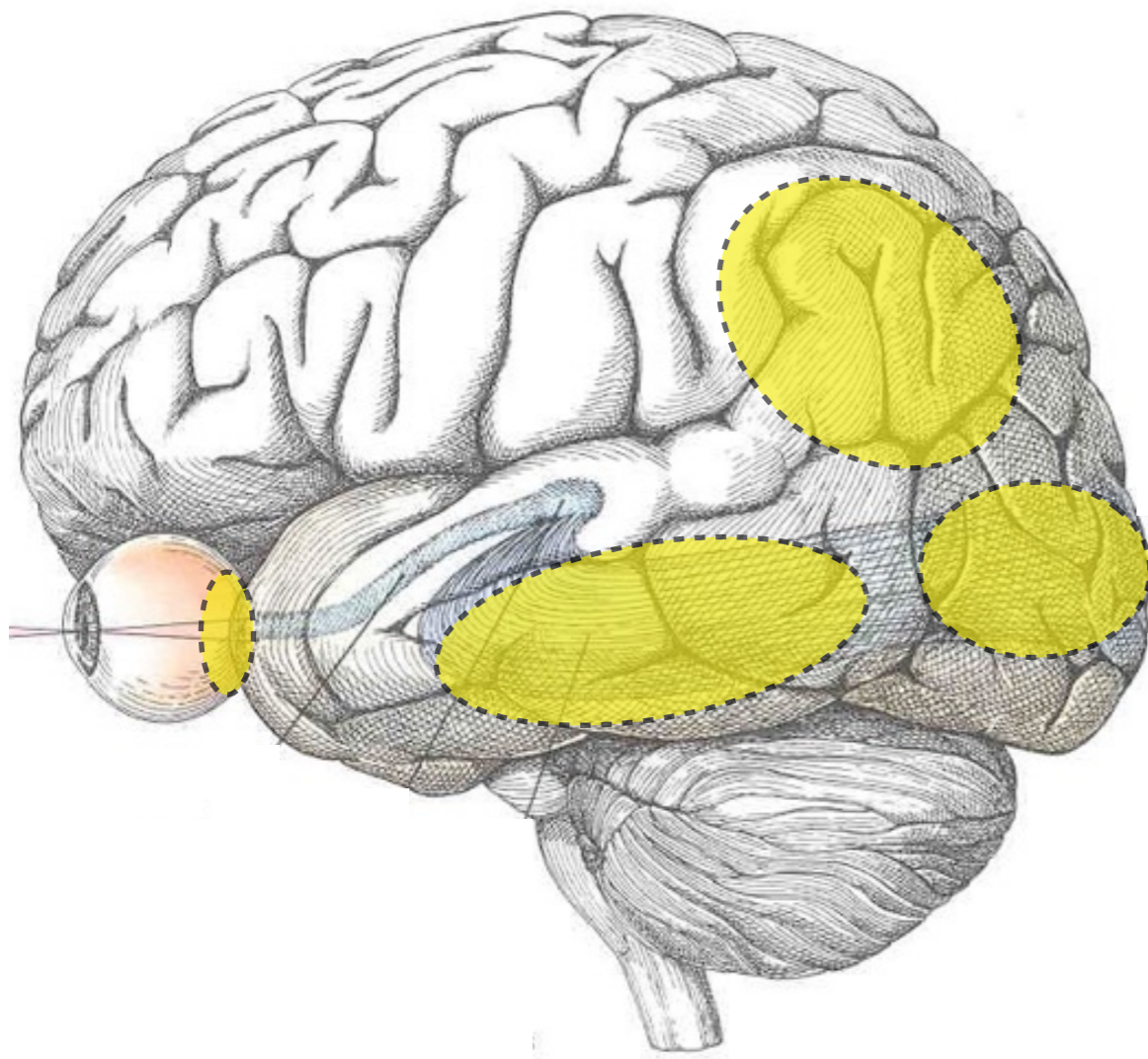


V1

- Simple visual features
- Orientation tuning

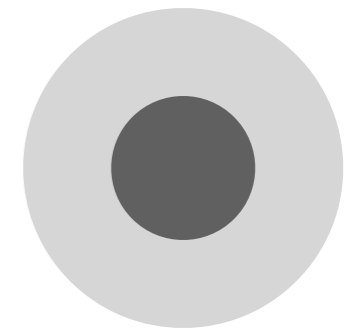


Building complex from simple



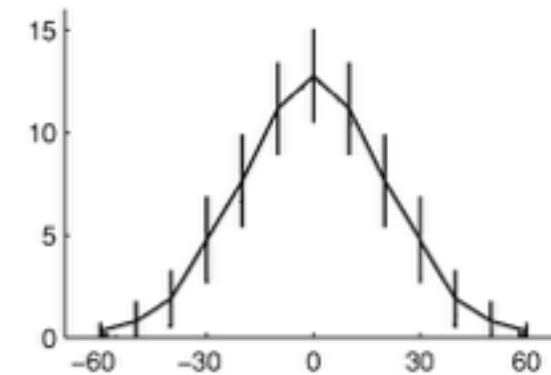
Retina

- Center-surround fields
- Contrast in space and time



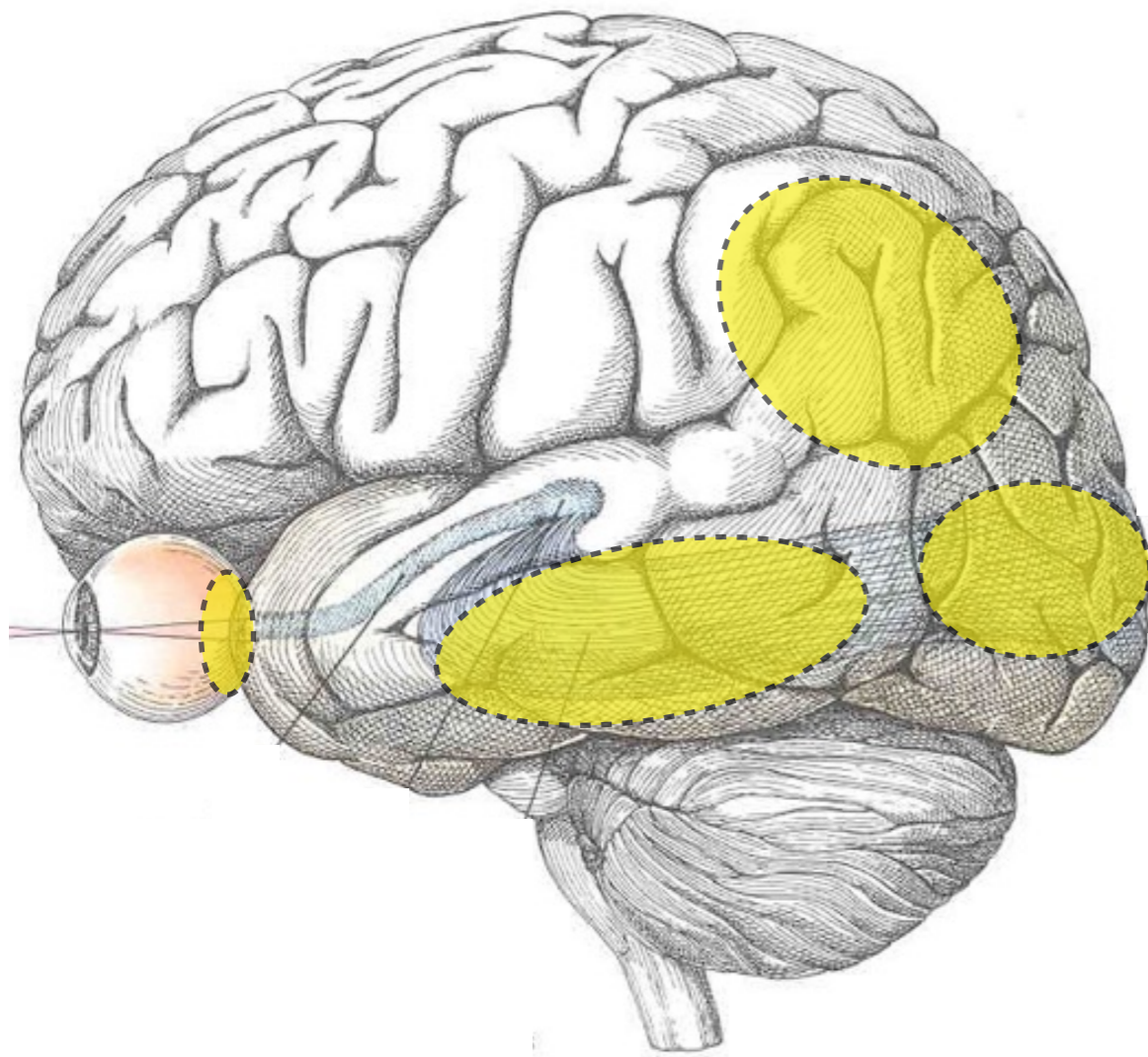
V1

- Simple visual features
- Orientation tuning



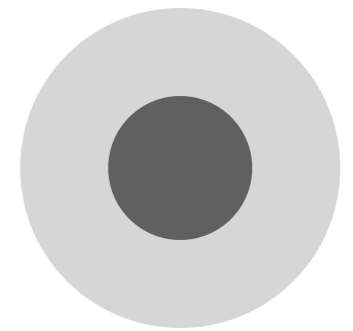
Higher visual areas

Building complex from simple



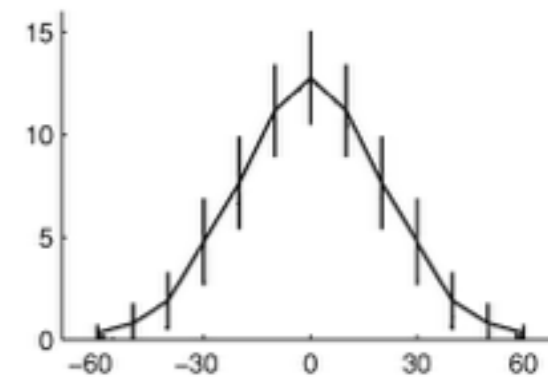
Retina

- Center-surround fields
- Contrast in space and time



V1

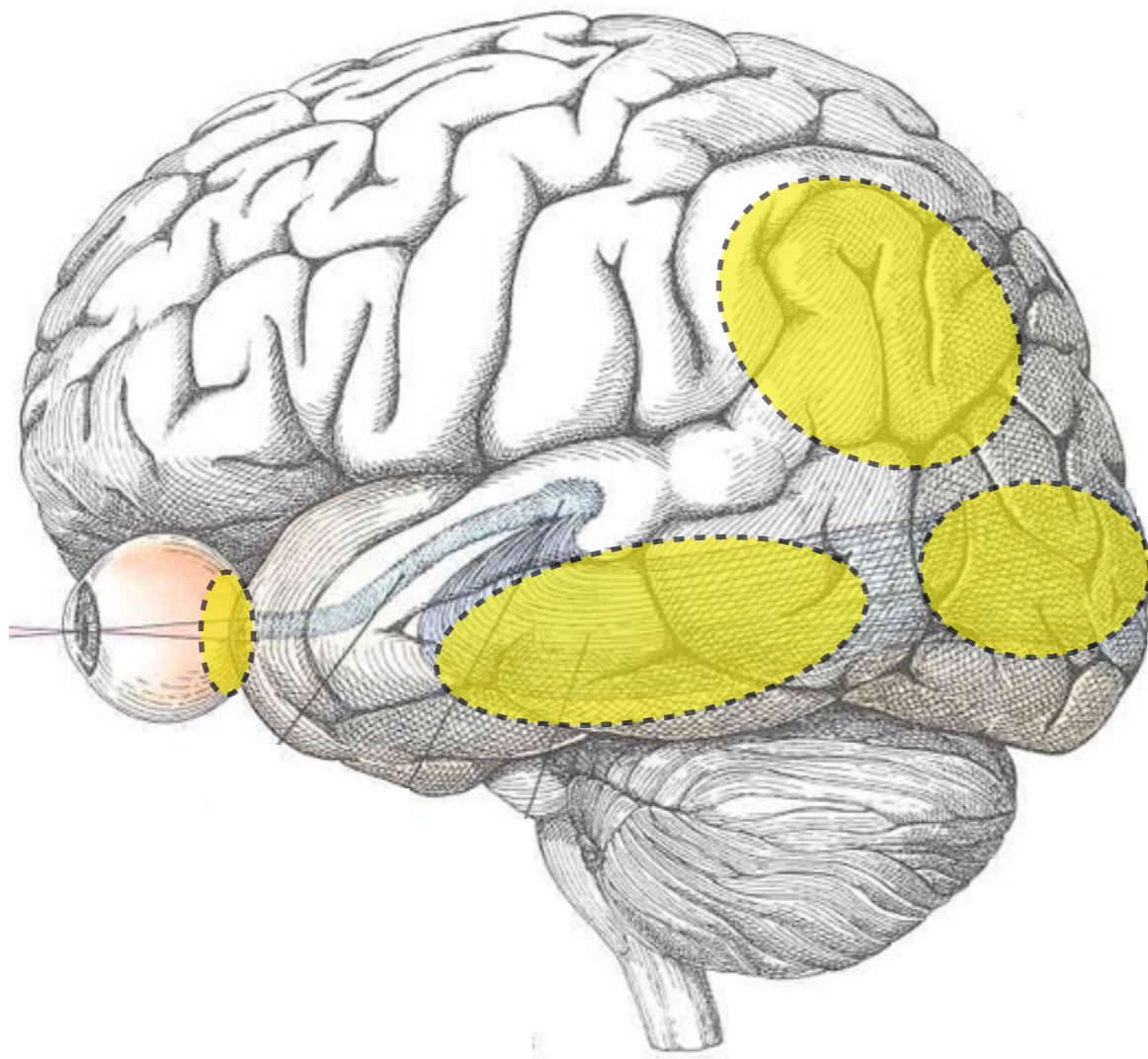
- Simple visual features
- Orientation tuning



Higher visual areas

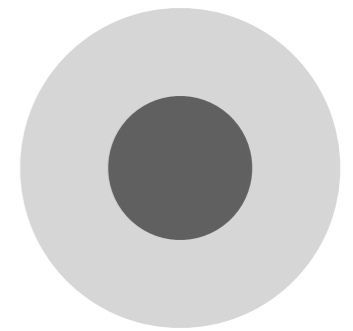
- MT: motion tuning

Building complex from simple



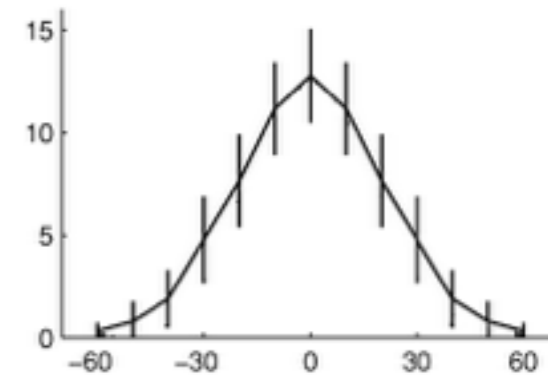
Retina

- Center-surround fields
- Contrast in space and time



V1

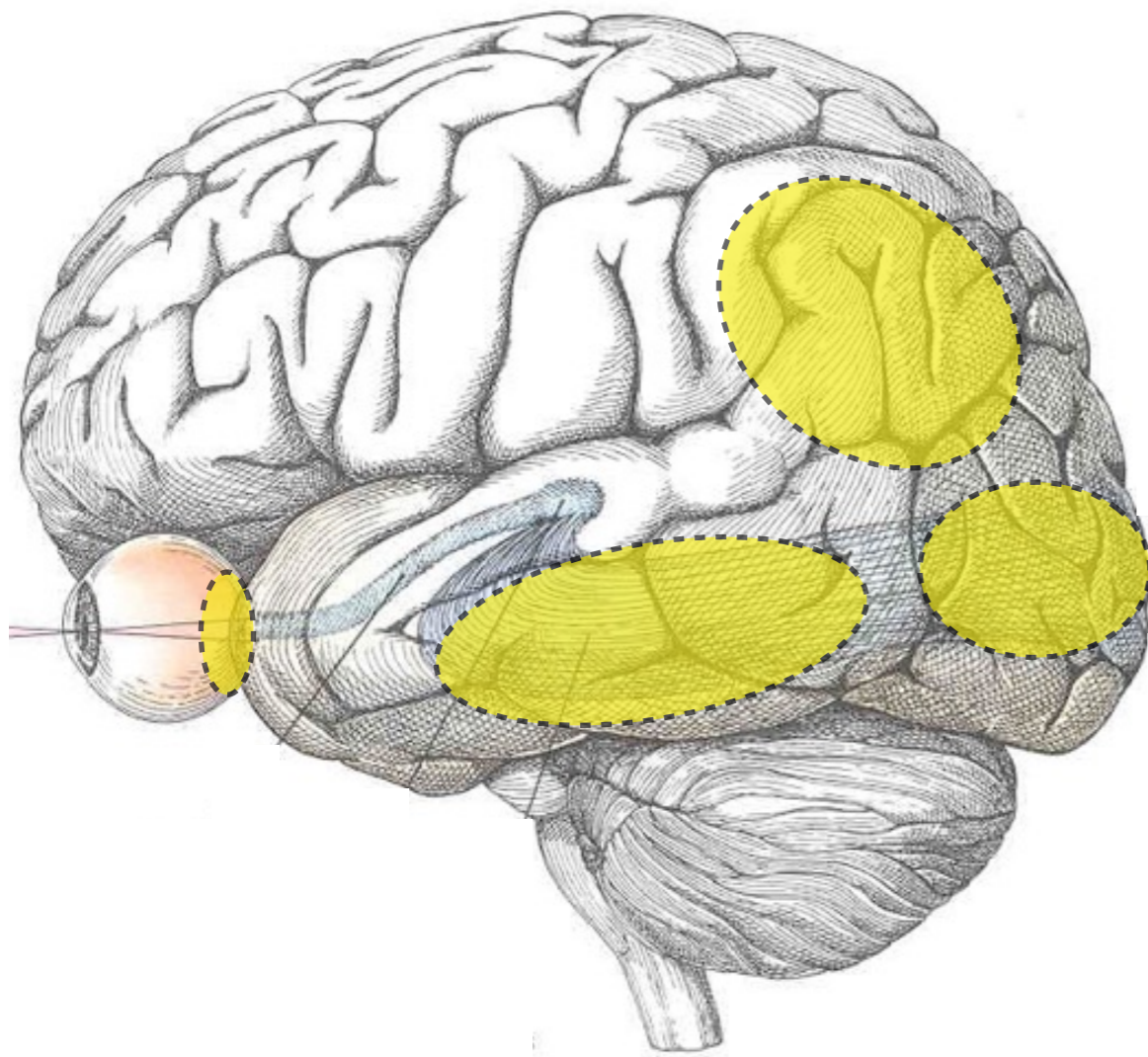
- Simple visual features
- Orientation tuning



Higher visual areas

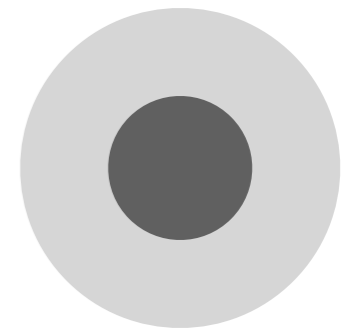
- MT: motion tuning
- IT: complex objects

Building complex from simple



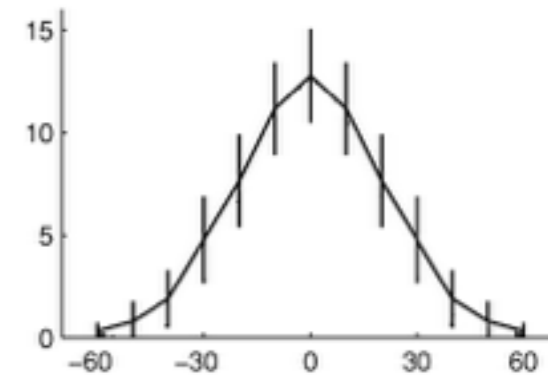
Retina

- Center-surround fields
- Contrast in space and time



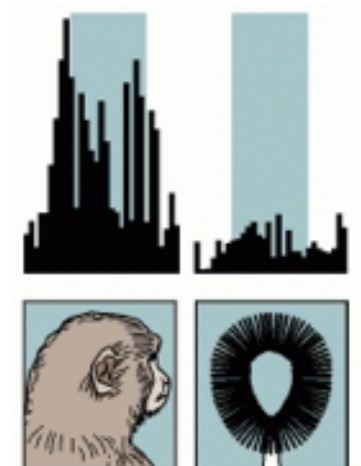
V1

- Simple visual features
- Orientation tuning



Higher visual areas

- MT: motion tuning
- IT: complex objects



Building complex from simple

Building complex from simple

An 'algorithm' for the visual system

Building complex from simple

An 'algorithm' for the visual system

- Break visual world into simple, easy-to-represent pieces

Building complex from simple

An 'algorithm' for the visual system

- Break visual world into simple, easy-to-represent pieces
- Build up selectivity to relevant features from these pieces

Building complex from simple

An 'algorithm' for the visual system

- Break visual world into simple, easy-to-represent pieces
- Build up selectivity to relevant features from these pieces

edge here

Building complex from simple

An 'algorithm' for the visual system

- Break visual world into simple, easy-to-represent pieces
- Build up selectivity to relevant features from these pieces

edge here + color here

Building complex from simple

An 'algorithm' for the visual system

- Break visual world into simple, easy-to-represent pieces
- Build up selectivity to relevant features from these pieces

edge here + color here + motion there + ...

Building complex from simple

An 'algorithm' for the visual system

- Break visual world into simple, easy-to-represent pieces
- Build up selectivity to relevant features from these pieces

edge here + color here + motion there + ... = **TIGER!**

The state of the art

The state of the art

What does the visual system *do*?

The state of the art

The state of the art

Represent the visual world

The state of the art

Represent the visual world
“Guess” what’s out there!

Vision as inference

Vision as inference

- 'Infer' something about the world

Vision as inference

- ‘Infer’ something about the world
- Should take into account past experiences

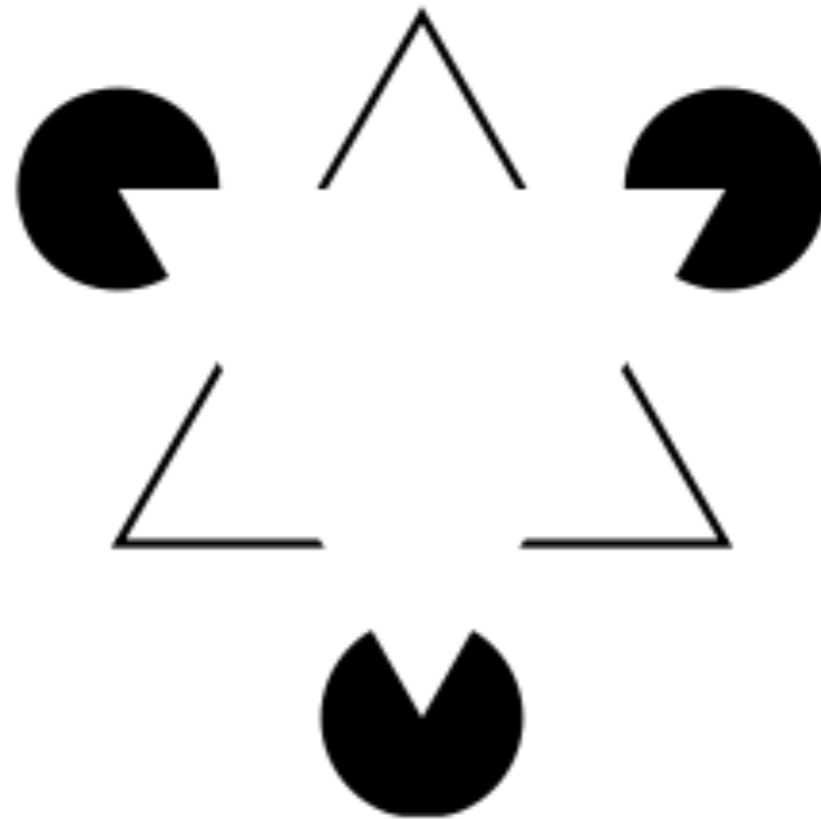
Vision as inference

Vision as inference

Illusory contours

Vision as inference

Illusory contours



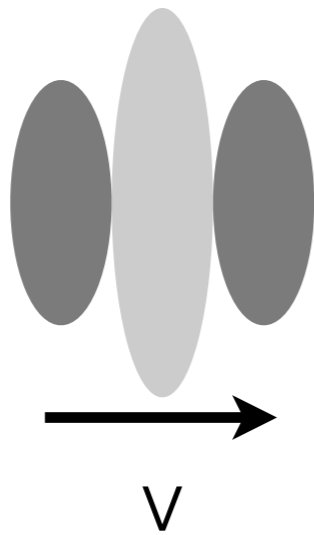
Vision as inference

Vision as inference

Objects perceived as moving more slowly than they are

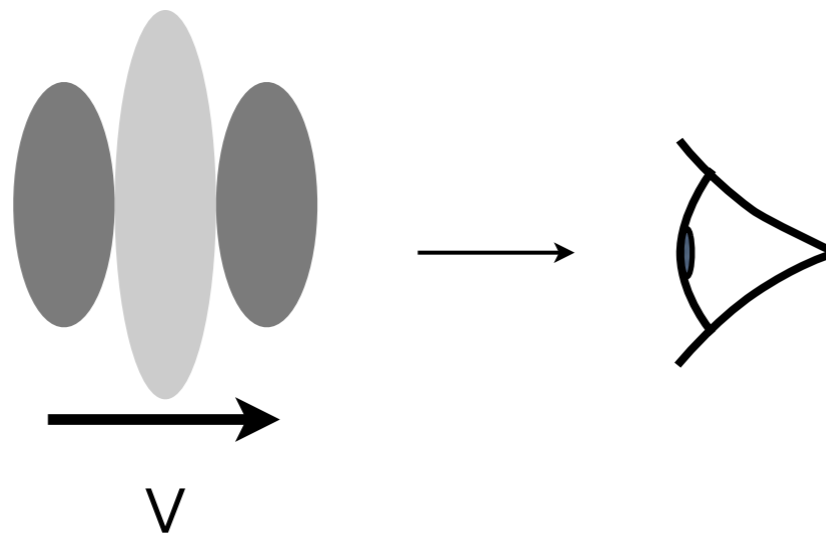
Vision as inference

Objects perceived as moving more slowly than they are



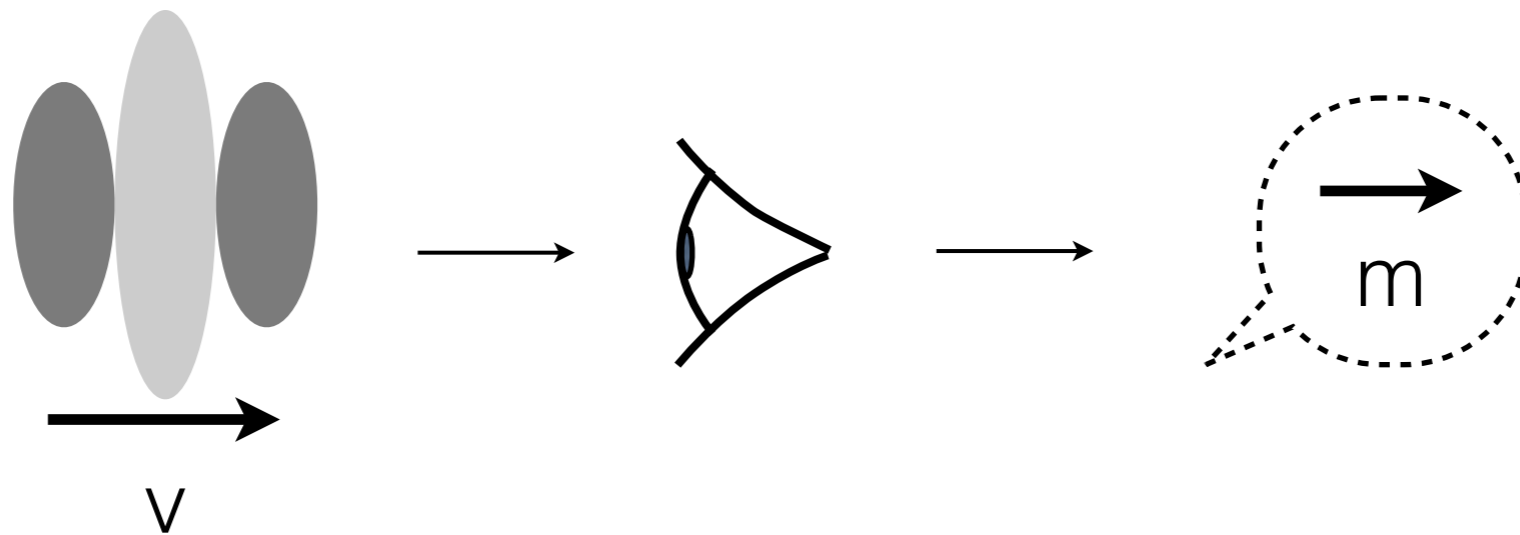
Vision as inference

Objects perceived as moving more slowly than they are



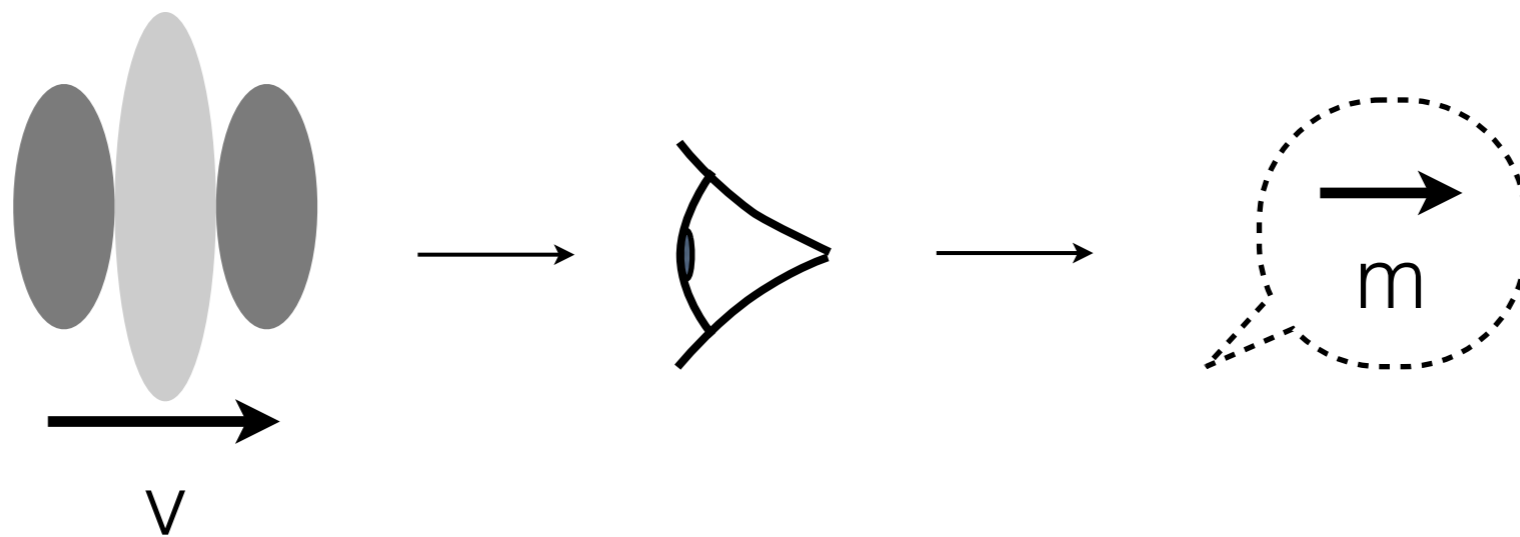
Vision as inference

Objects perceived as moving more slowly than they are



Vision as inference

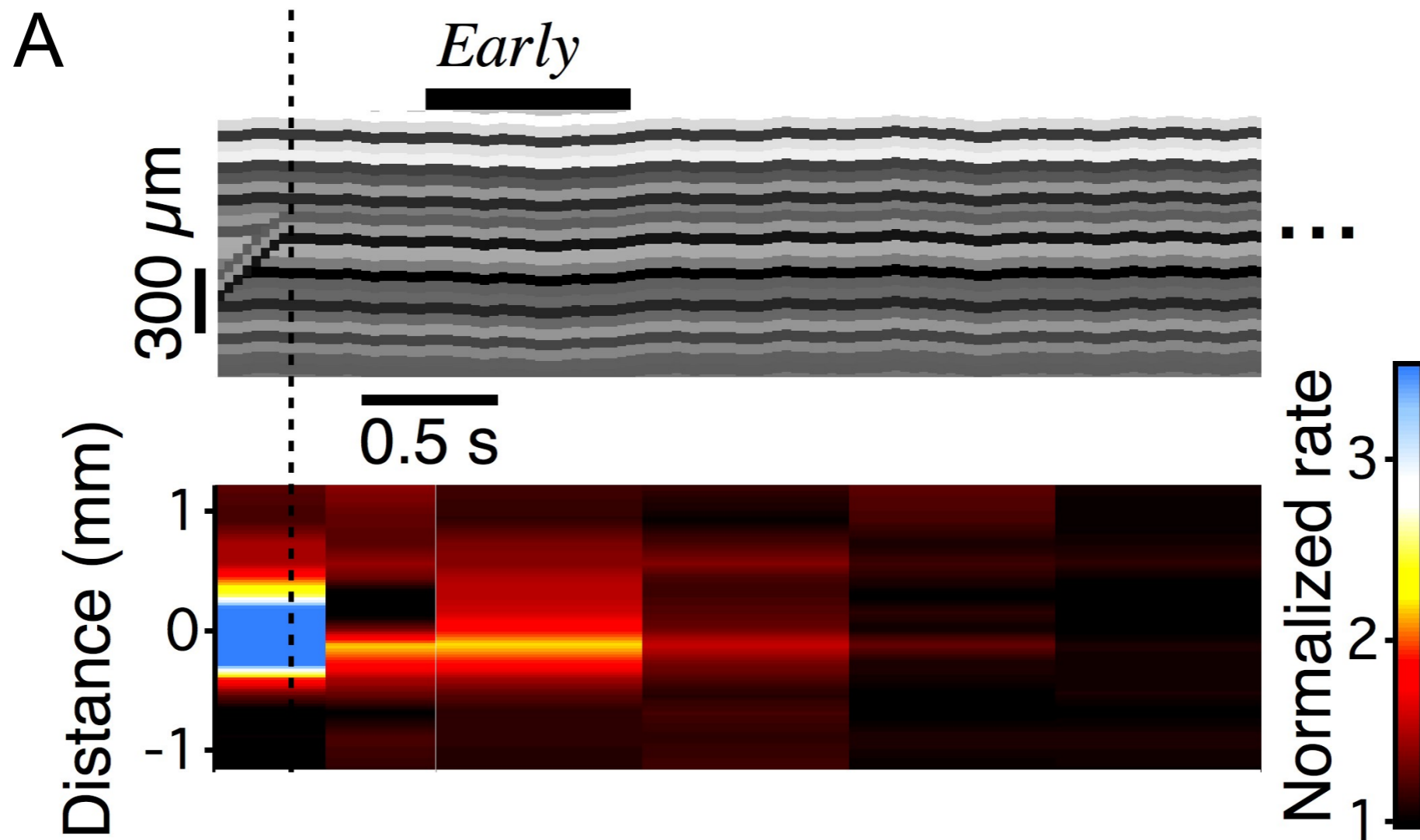
Objects perceived as moving more slowly than they are



But things move slowly!

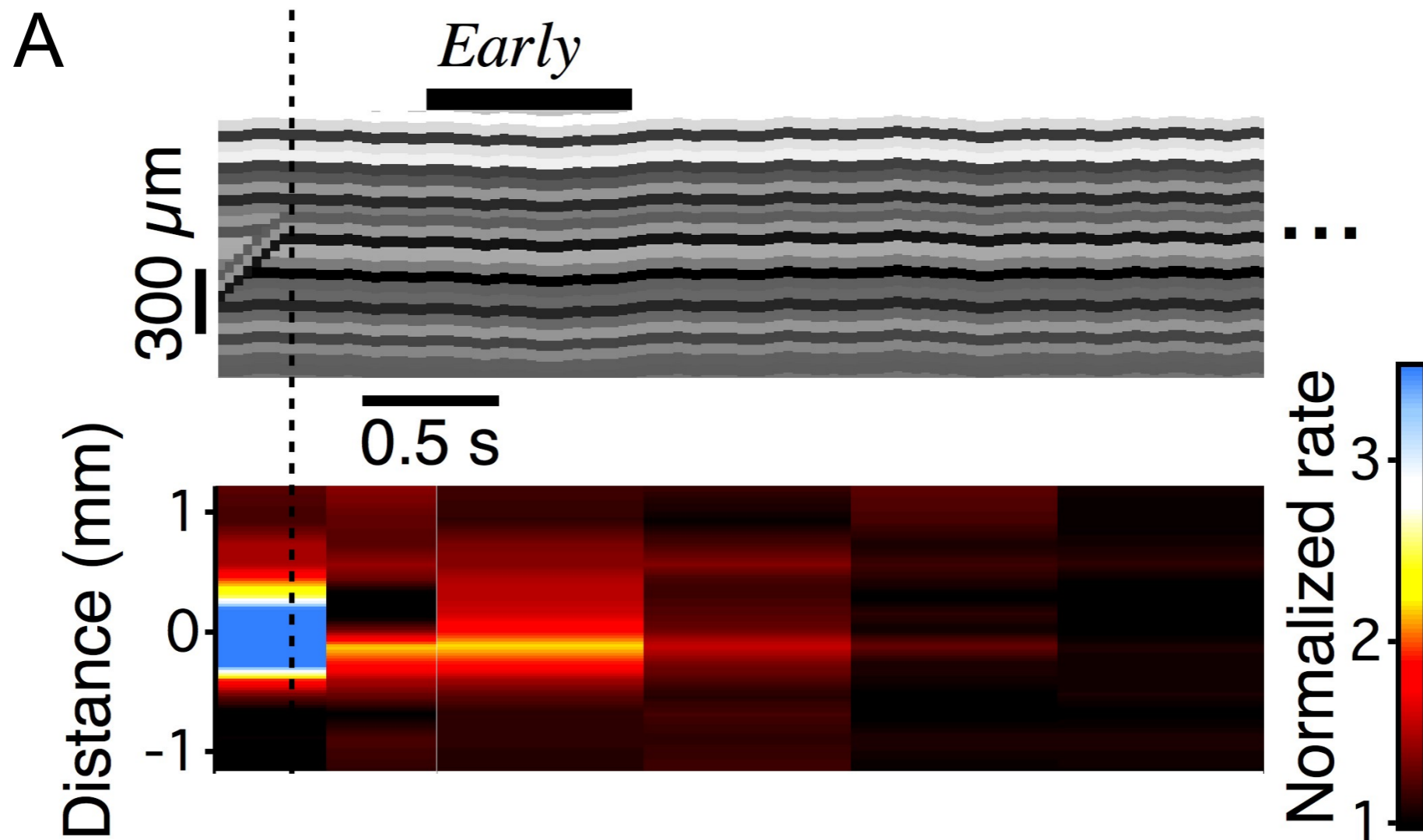
Vision as inference

Vision as inference



Vision as inference

Certain ganglion cells
'remember' an object's location



Looking forward

Looking forward

It is possible that we've dramatically underestimated the complexity of the visual system



An introduction to the visual system

Thank you!

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bnaecker@stanford.edu