

**Learning about vision:  
things we now know,  
things we still don't know,  
and things we don't know we don't know.**

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Helen Wills Neuroscience Institute, School of Optometry  
and Redwood Center for Theoretical Neuroscience  
UC Berkeley



**REDWOOD CENTER**  
for Theoretical Neuroscience



# Learning about vision

It's a really hard problem.

We have made progress

...but we are still confronted with profound mysteries

and some of the most important questions have not yet been asked.

MASSACHUSETTS INSTITUTE OF TECHNOLOGY

PROJECT MAC

Subgoal for July

Analysis of scenes consisting of non-overlapping objects from the following set:

balls

bricks with faces of the same or different colors or textures

cylinders.

Each face will be of uniform and distinct color and/or texture.

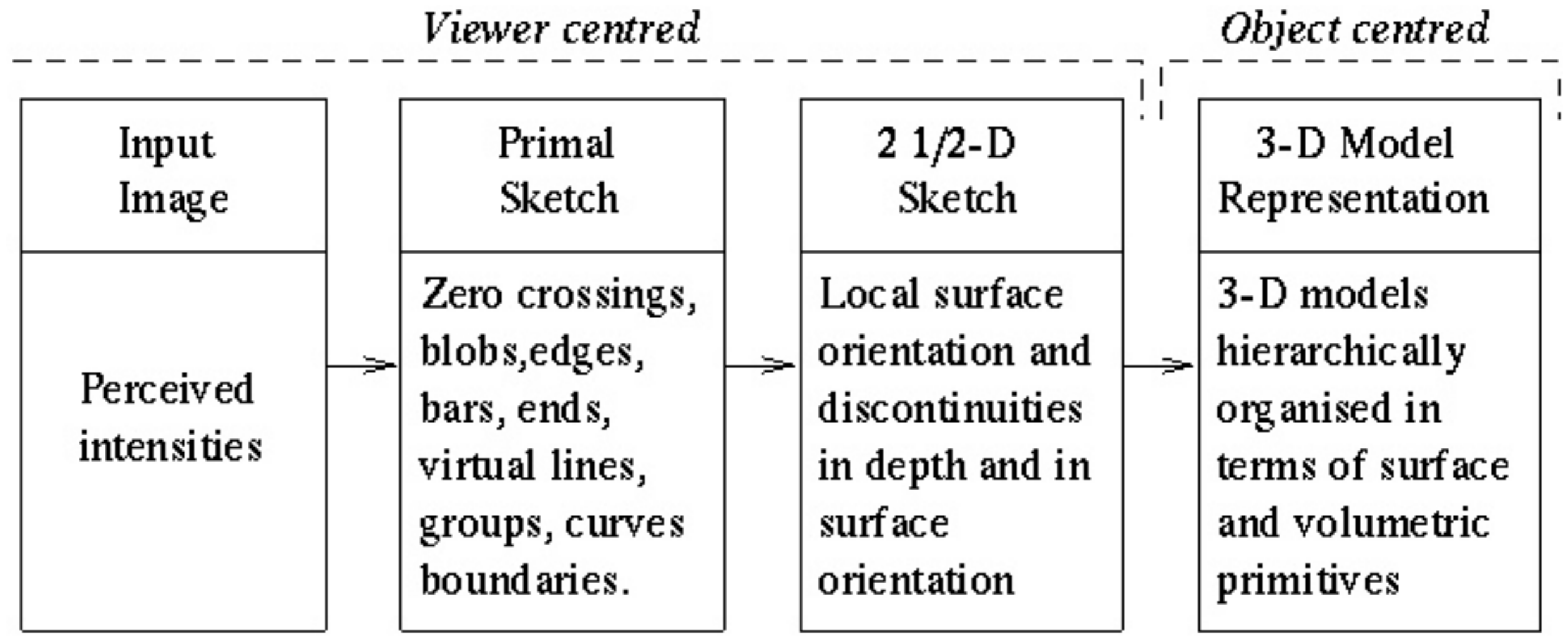
Background will be homogeneous.

Extensions for August

The first priority will be to handle objects of the same sort but with complex surfaces and backgrounds, e.g. cigarette pack with writing and bands of different color, or a cylindrical battery.

Then extend class of objects to objects like tools, cups, etc.

# The approach of David Marr

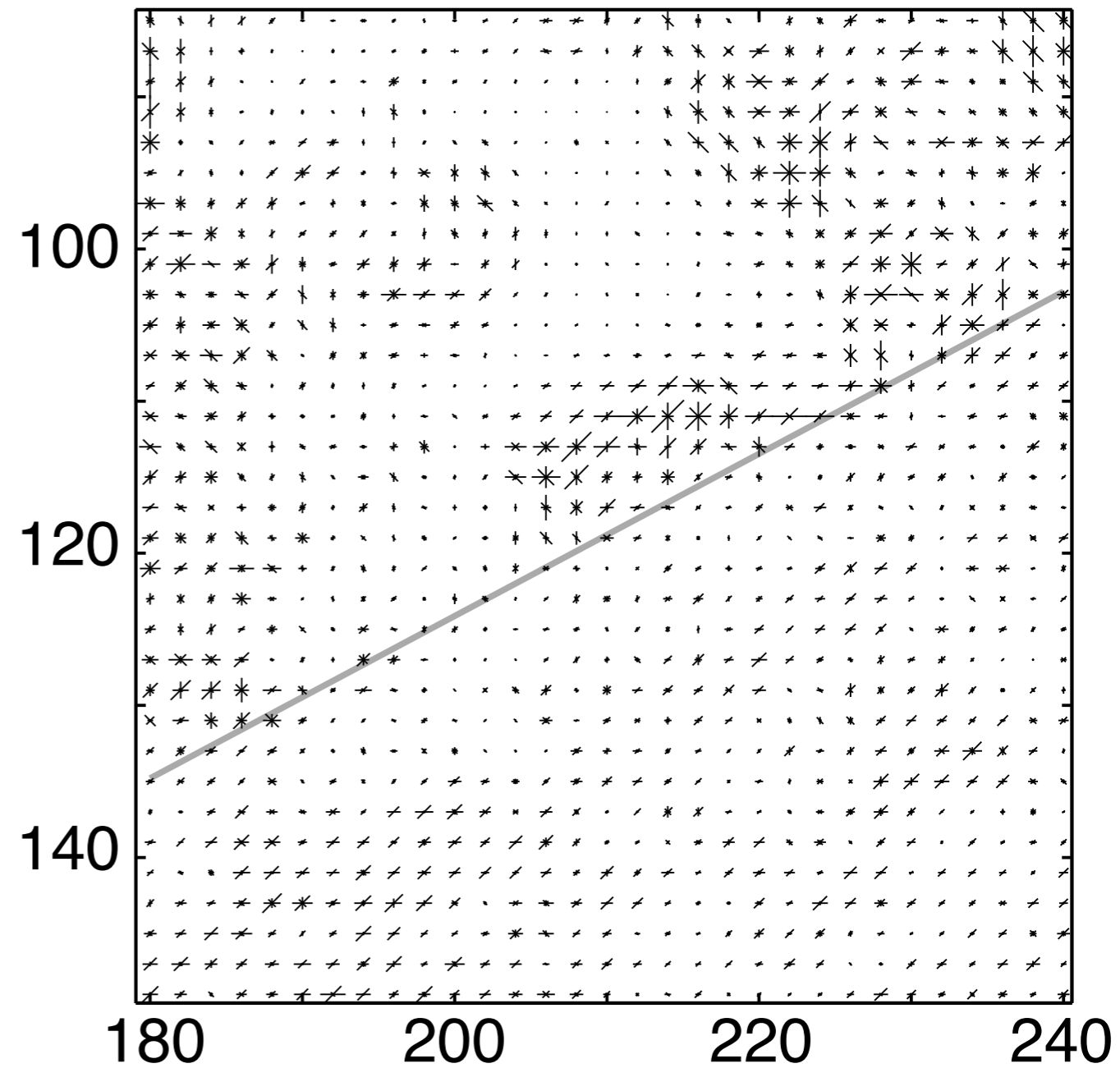
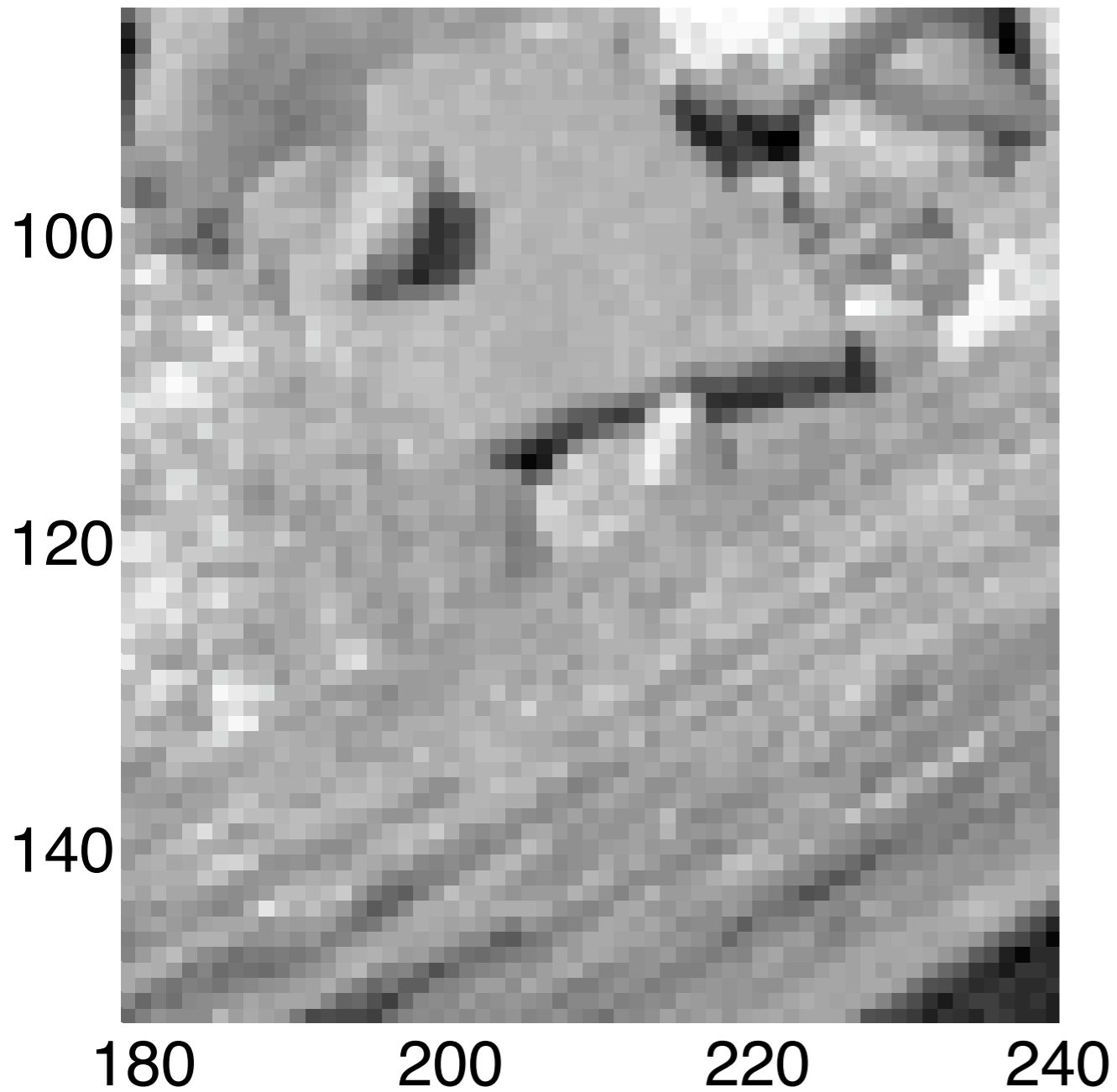




# Natural images are full of ambiguity

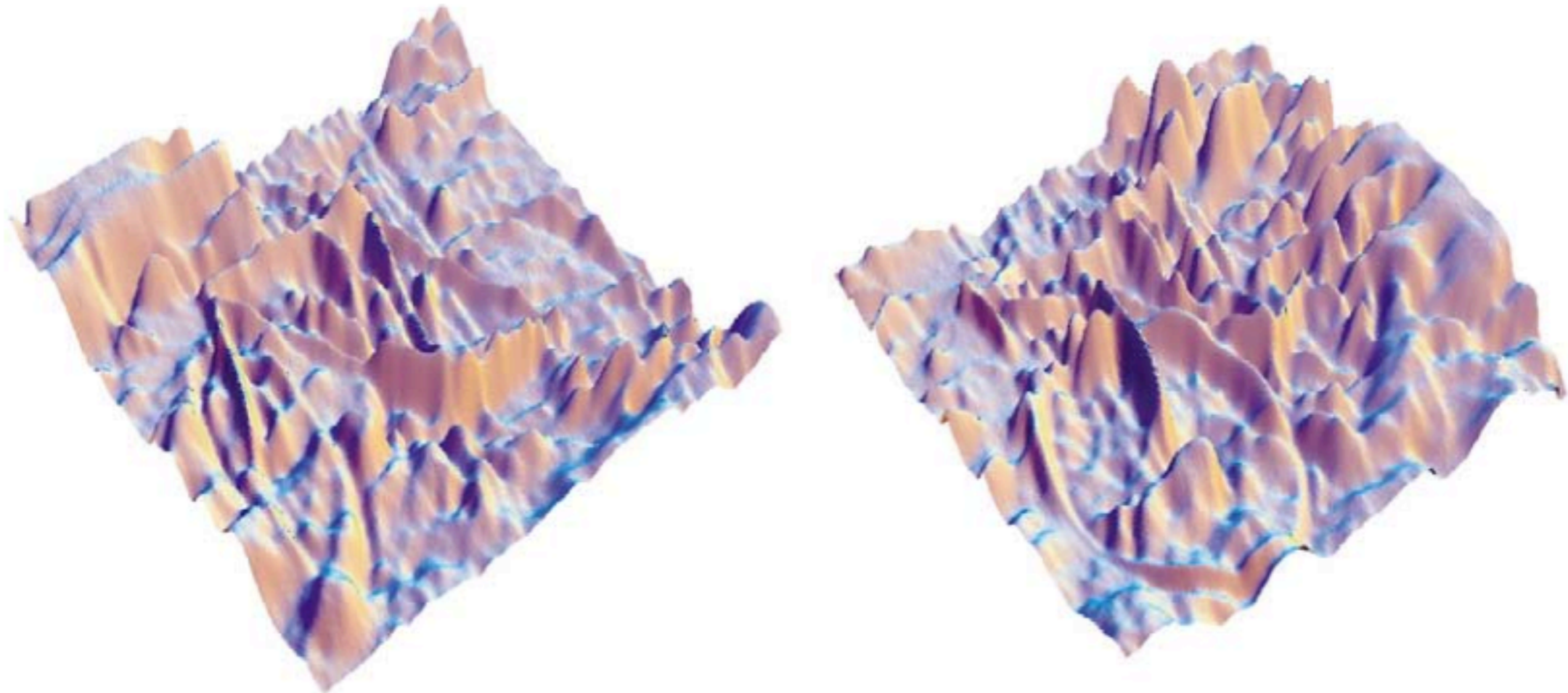


# Natural images are full of ambiguity



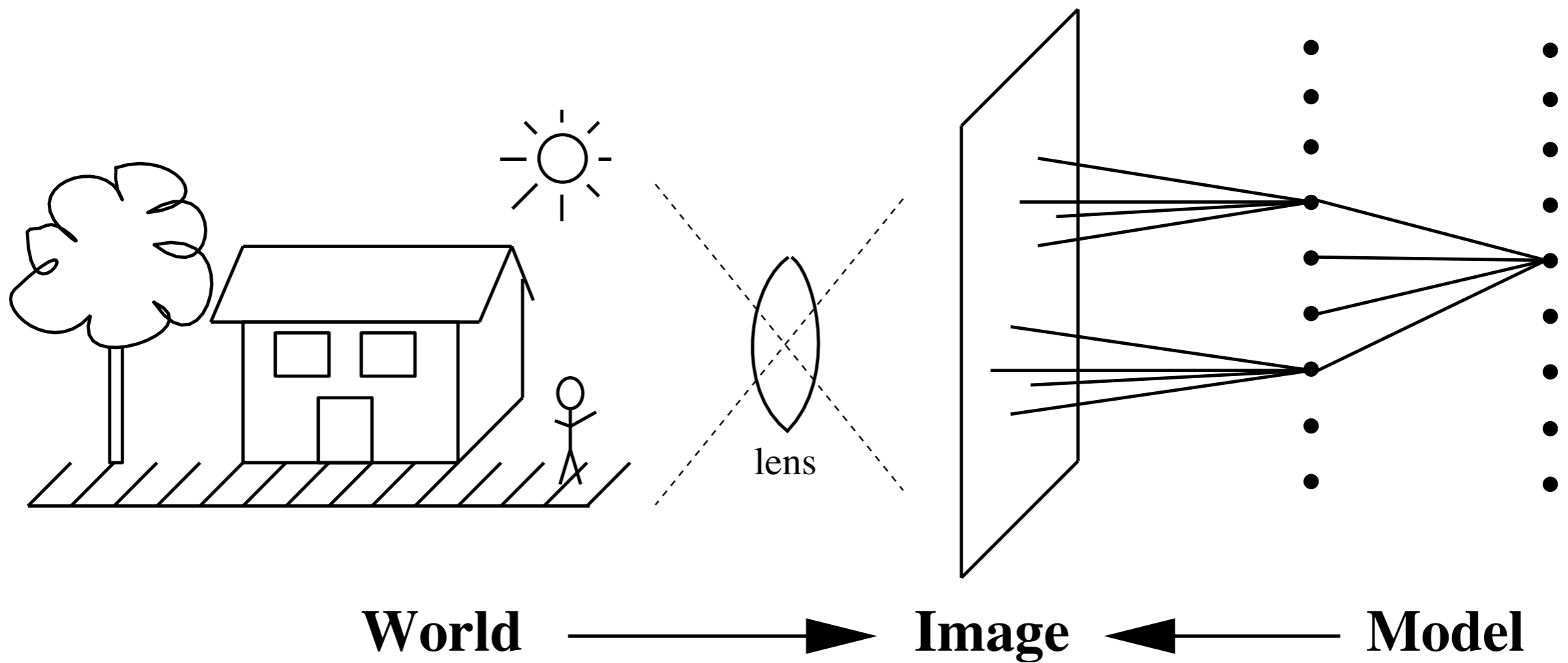


# What do these patterns depict?

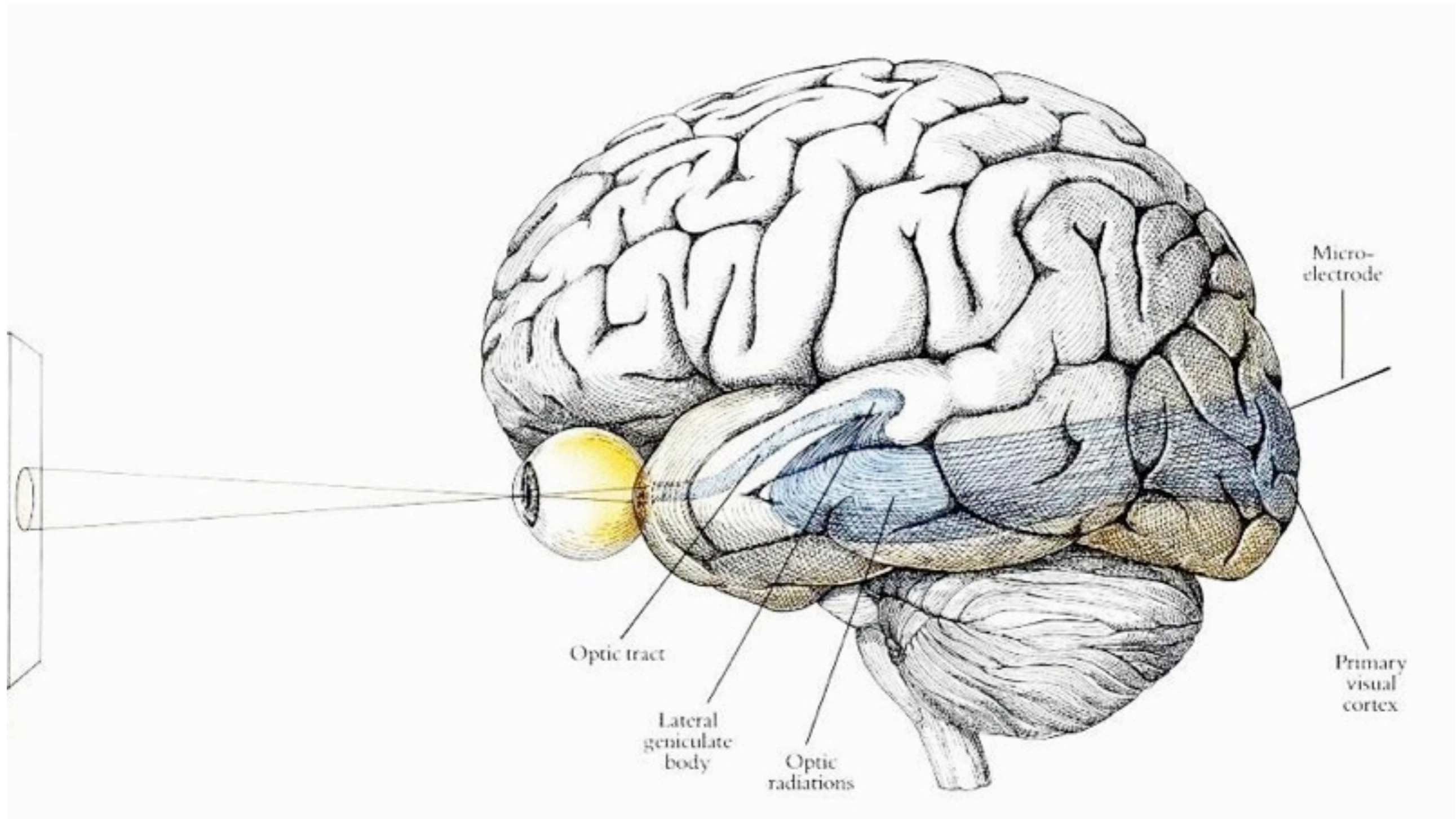


(from Kersten & Yuille, 2003)

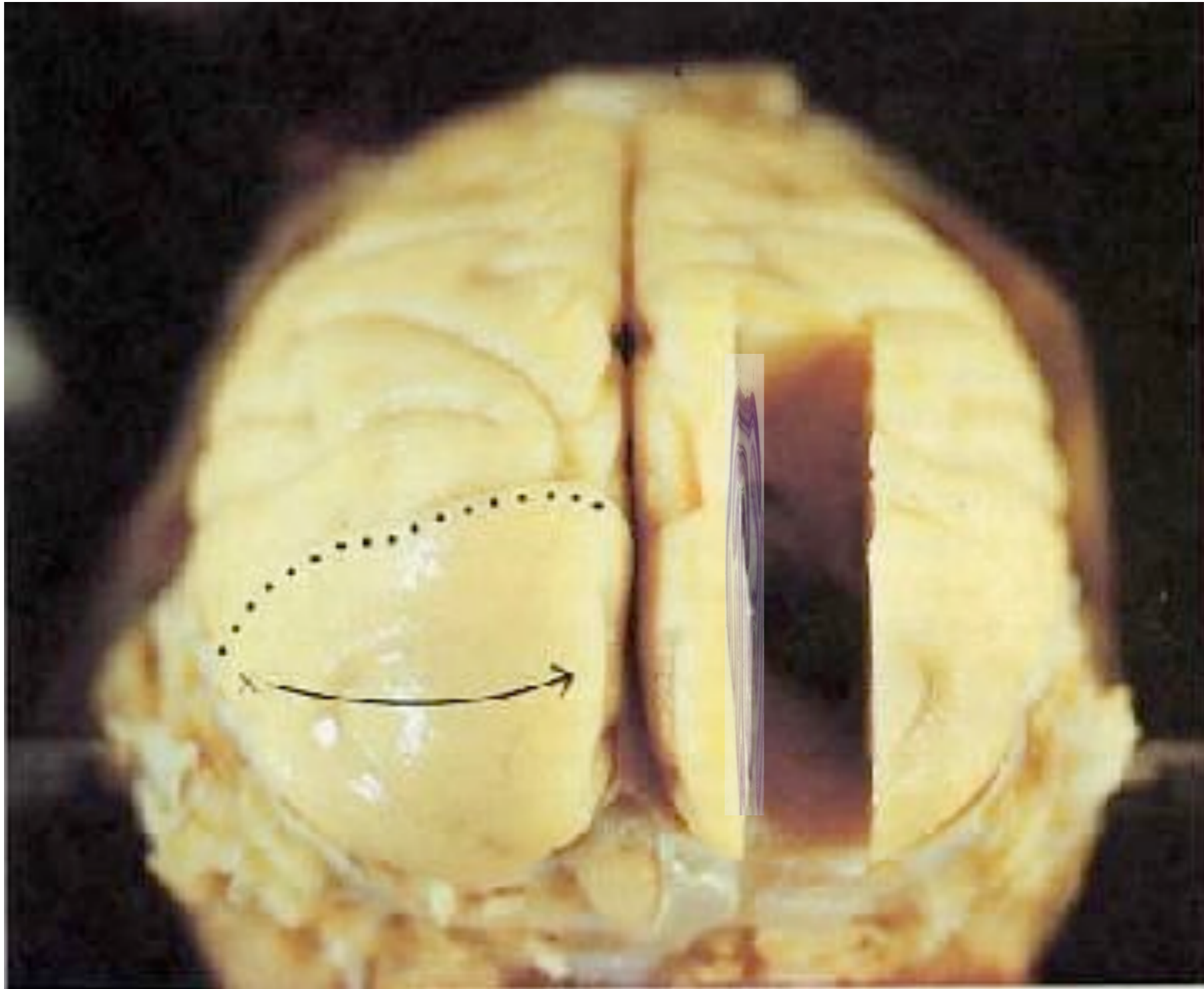
# Vision as inference

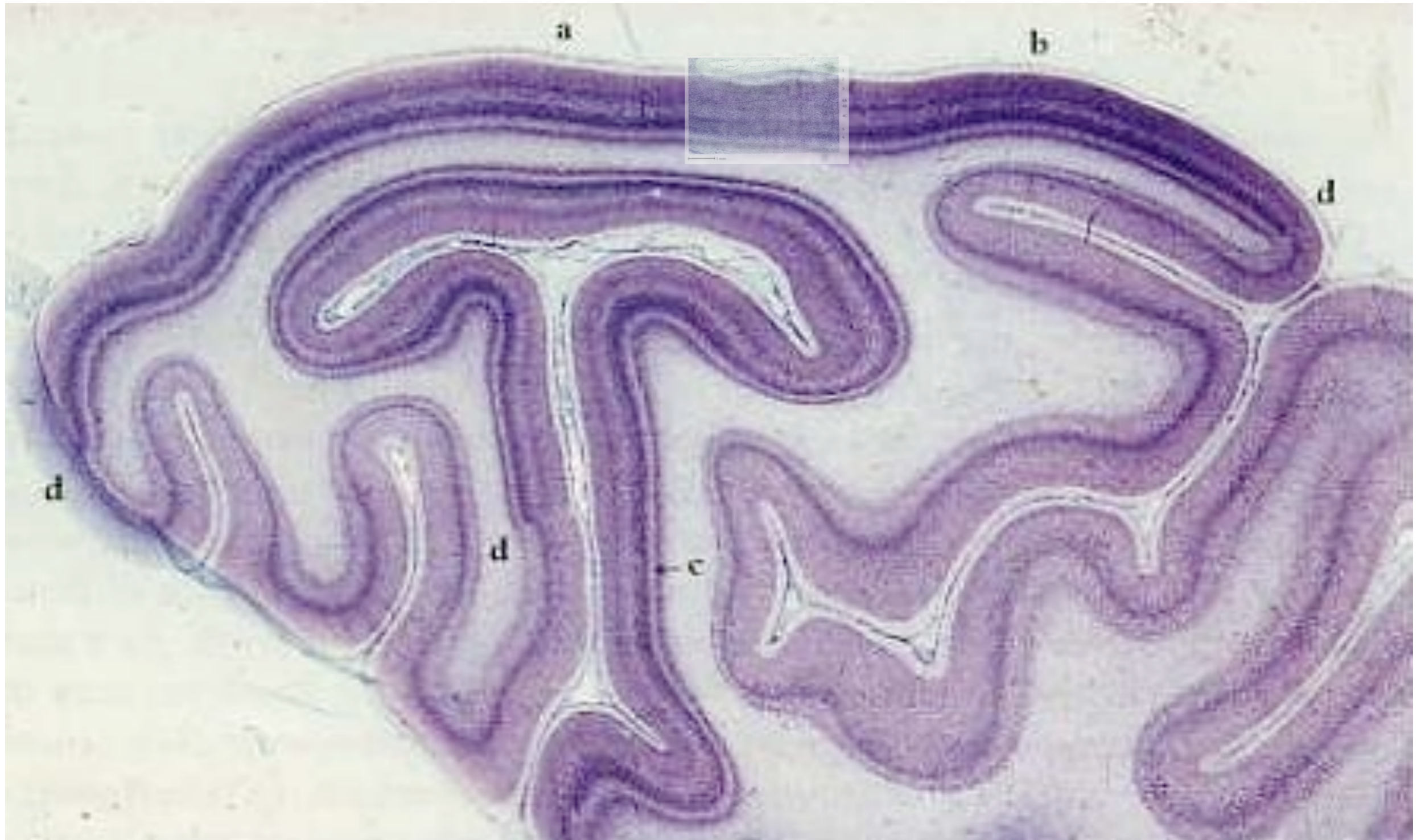


# Nervous systems are difficult to penetrate

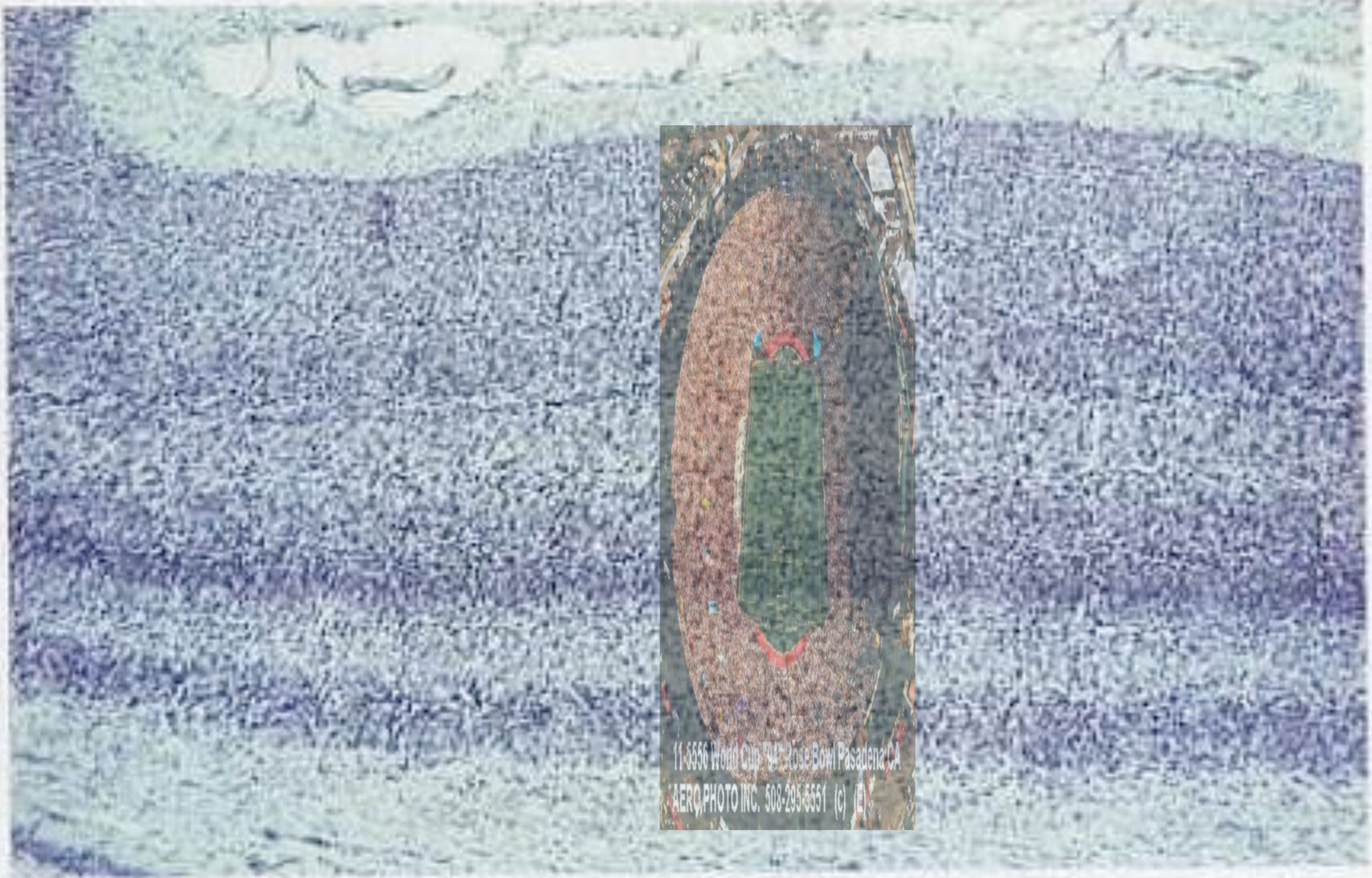










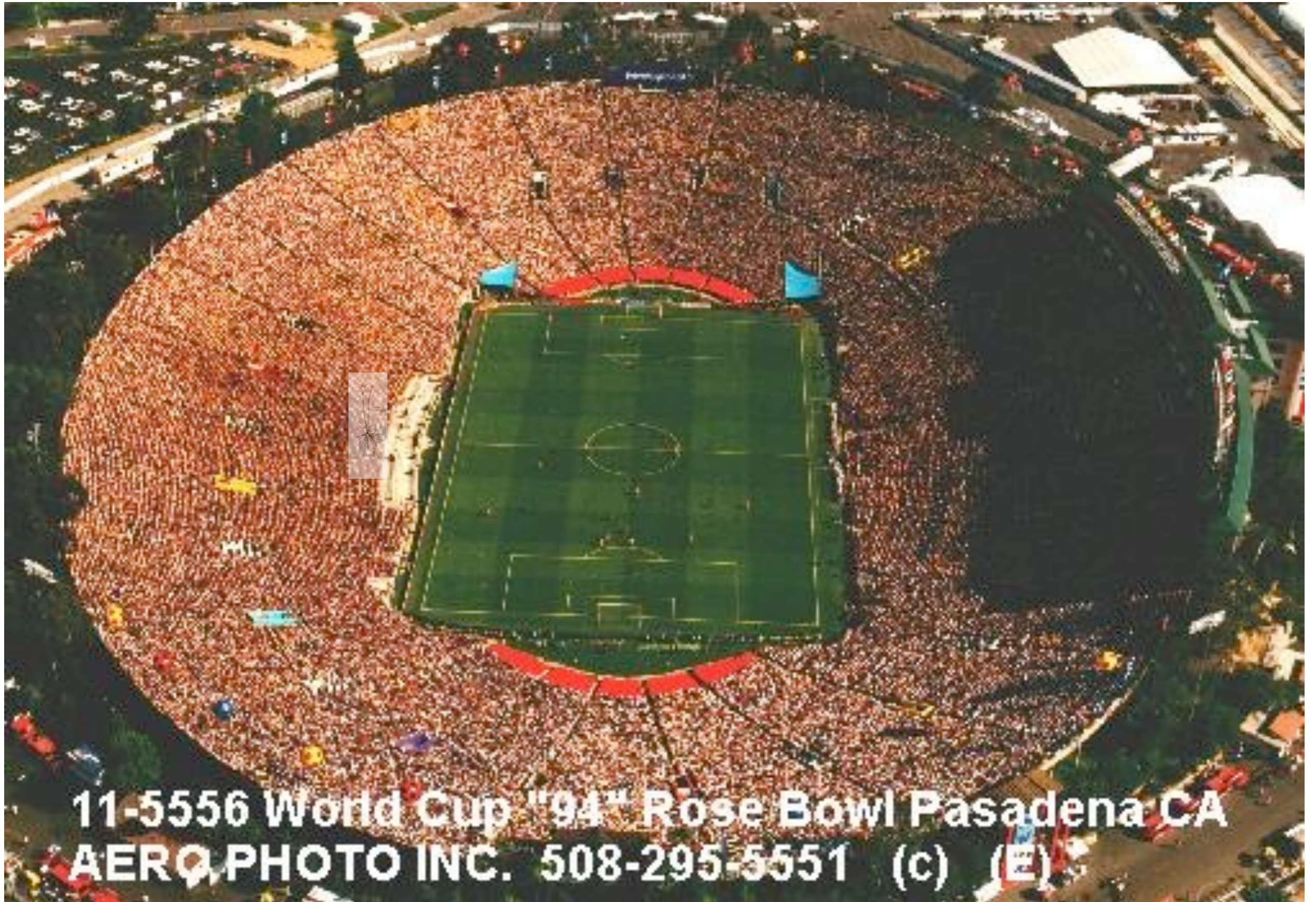


1 mm

1  
2  
3  
4A  
4B  
4C  
5  
6

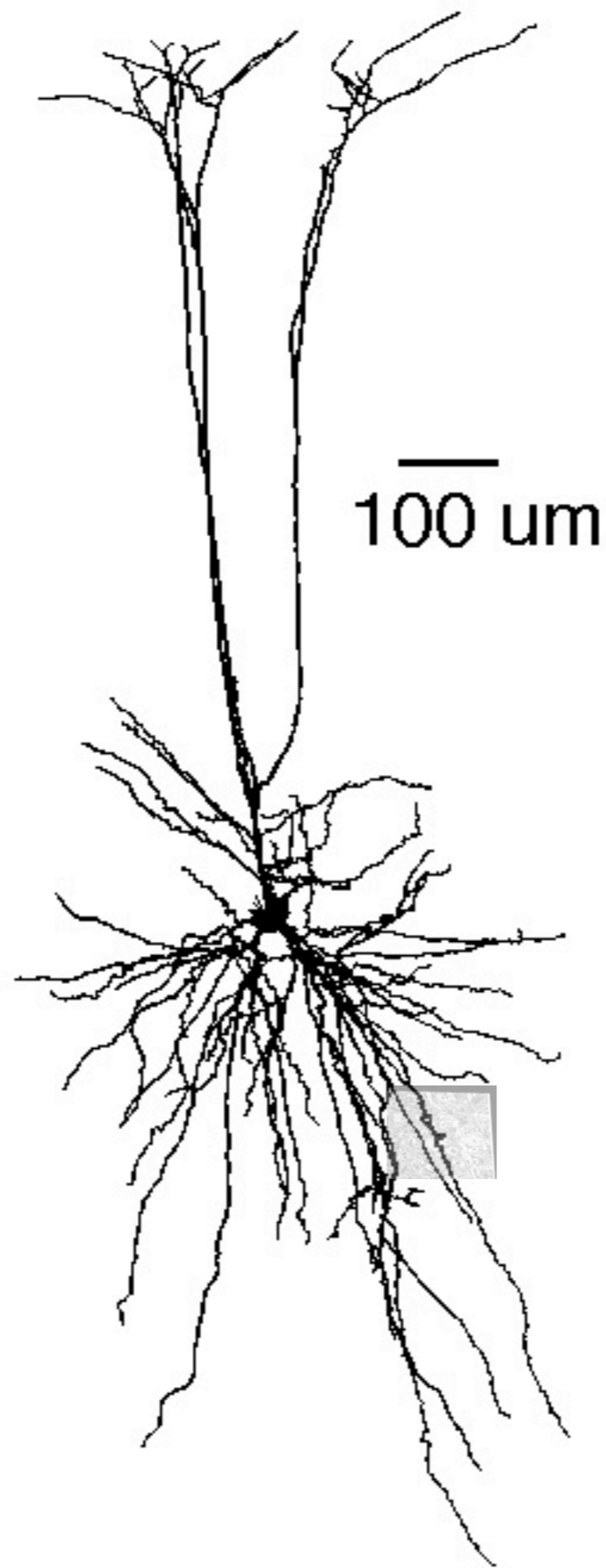
11-5556 World Cup '94" Rose Bowl Pasadena CA  
AERQ PHOTO INC. 503-295-5551 (c) (E)





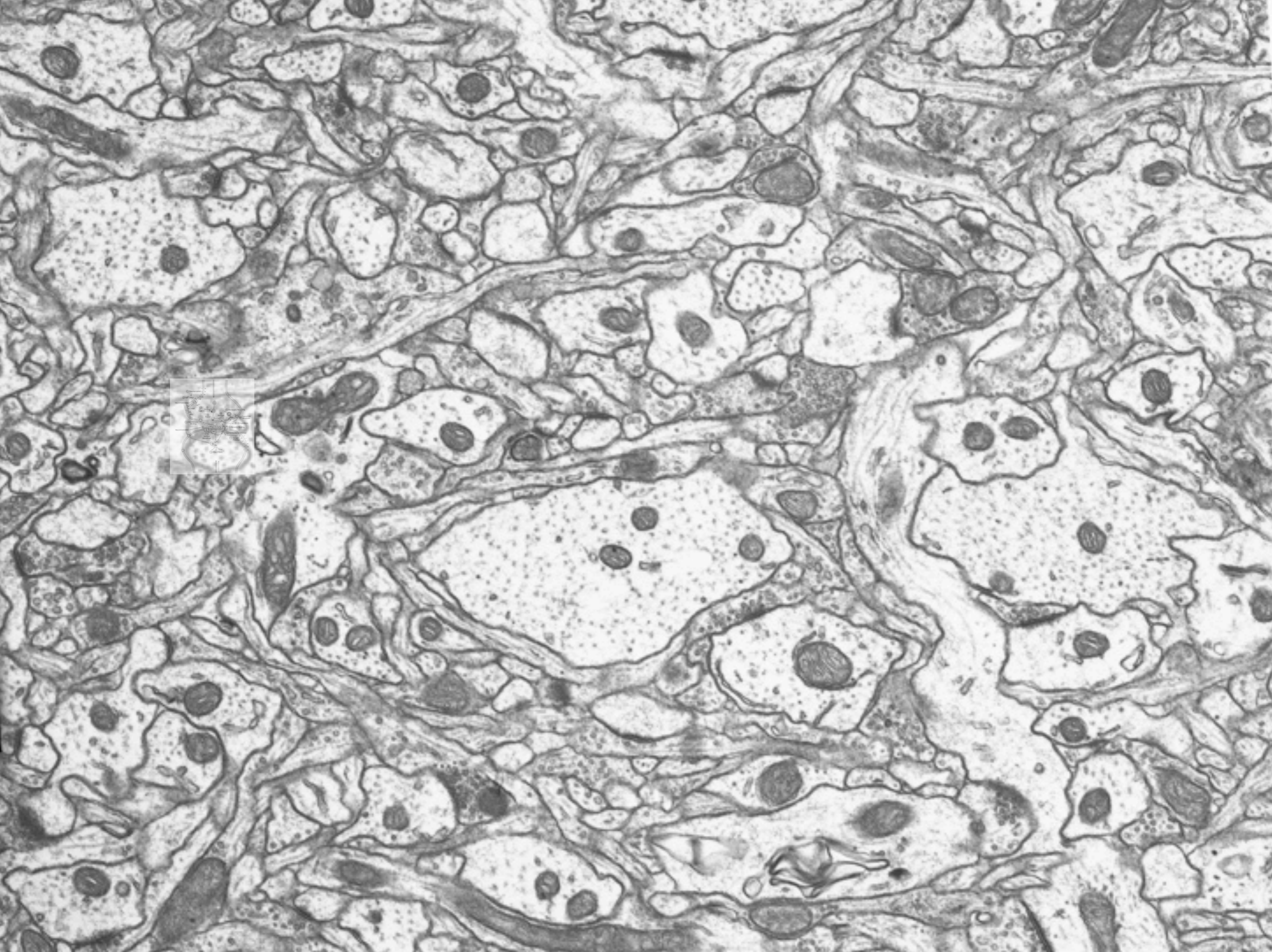
11-5556 World Cup "94" Rose Bowl Pasadena CA  
AERO PHOTO INC. 508-295-5551 (c) (E)





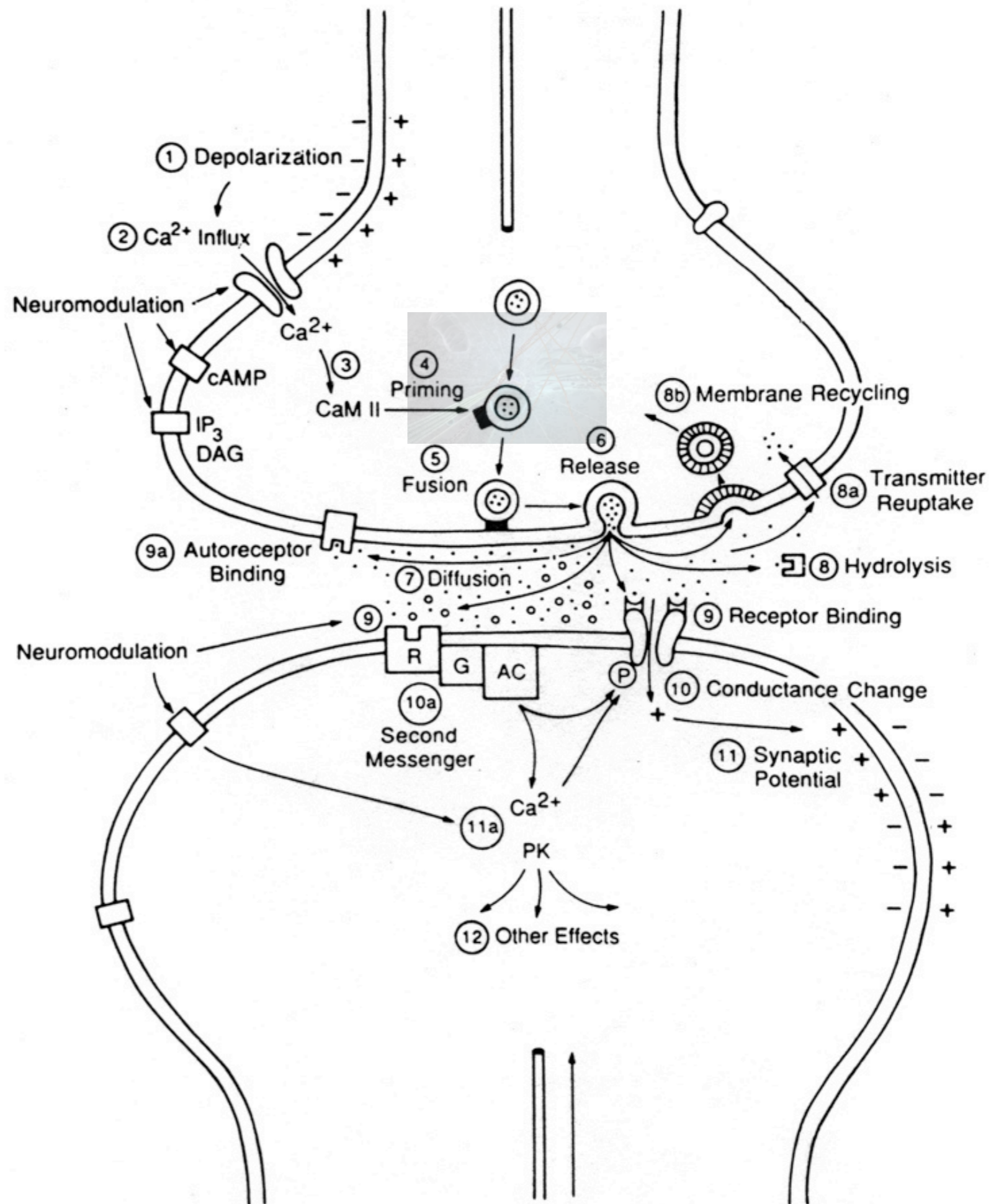
100 um







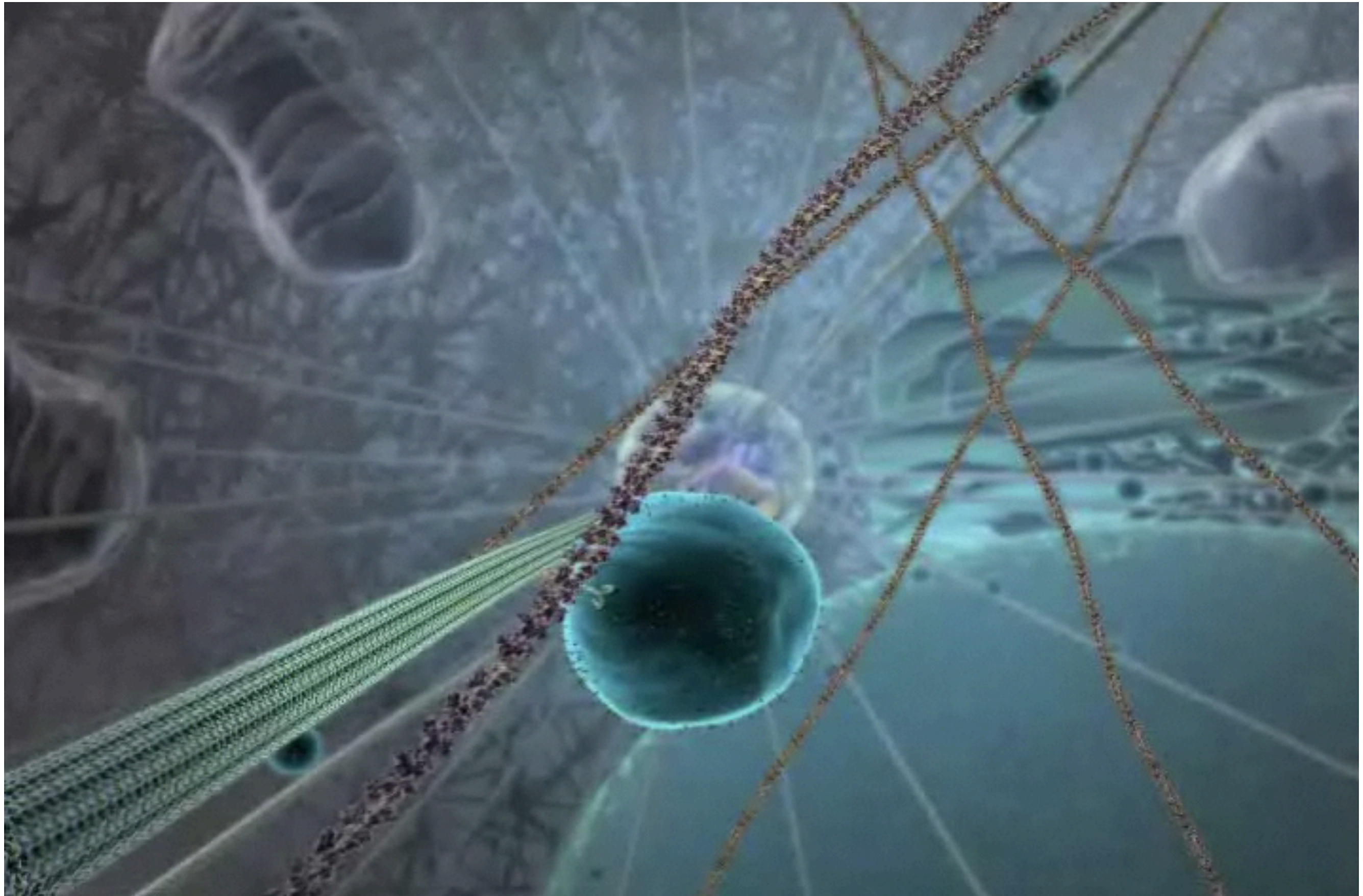
# Anatomy of a synapse





# Inner life of the cell

<http://multimedia.mcb.harvard.edu/>



# Progress

Adaptive optics retinal circuitry

Functional imaging and multiple unit recording

Natural scene statistics and visual coding

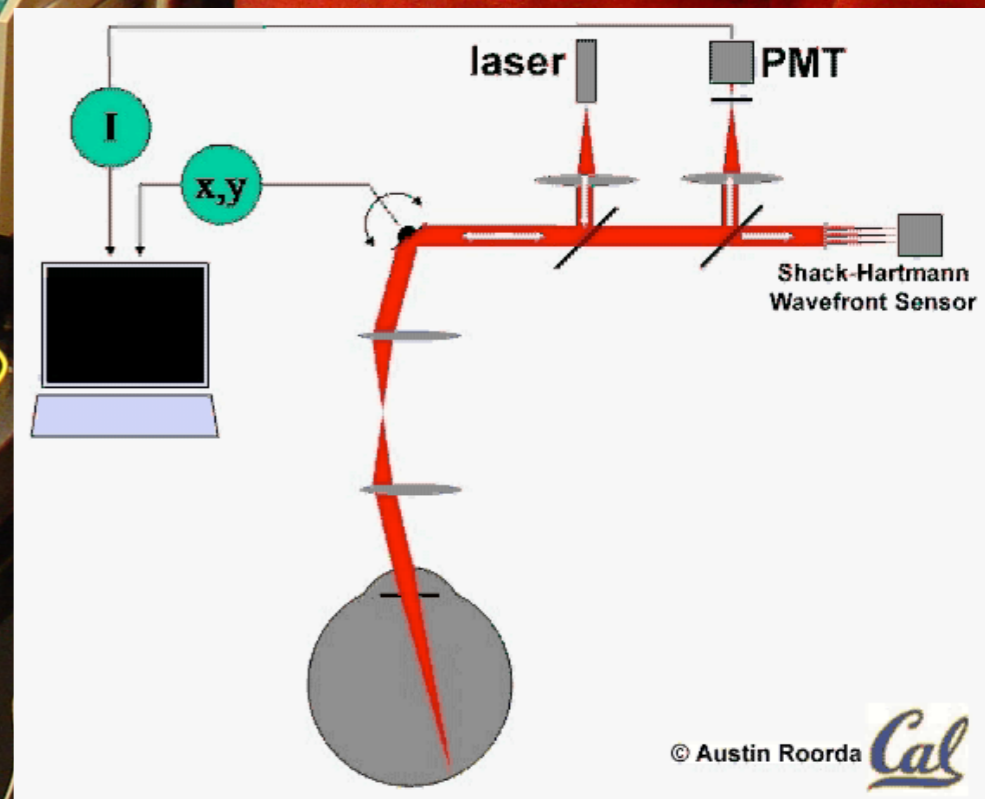
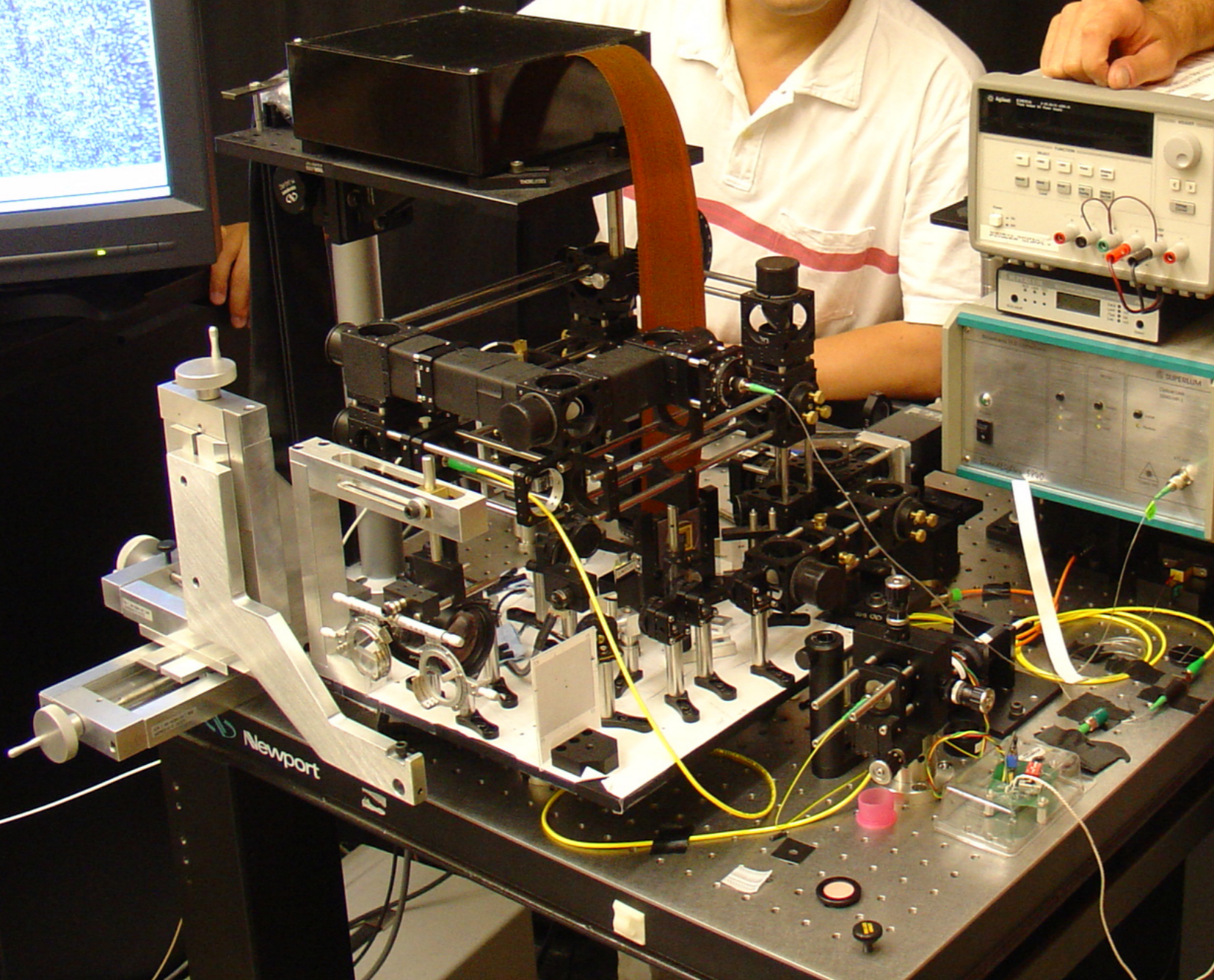
Computer vision: multiple-view geometry



# Adaptive Optics Scanning Laser Ophthalmoscope

Yuhua  
Zhang

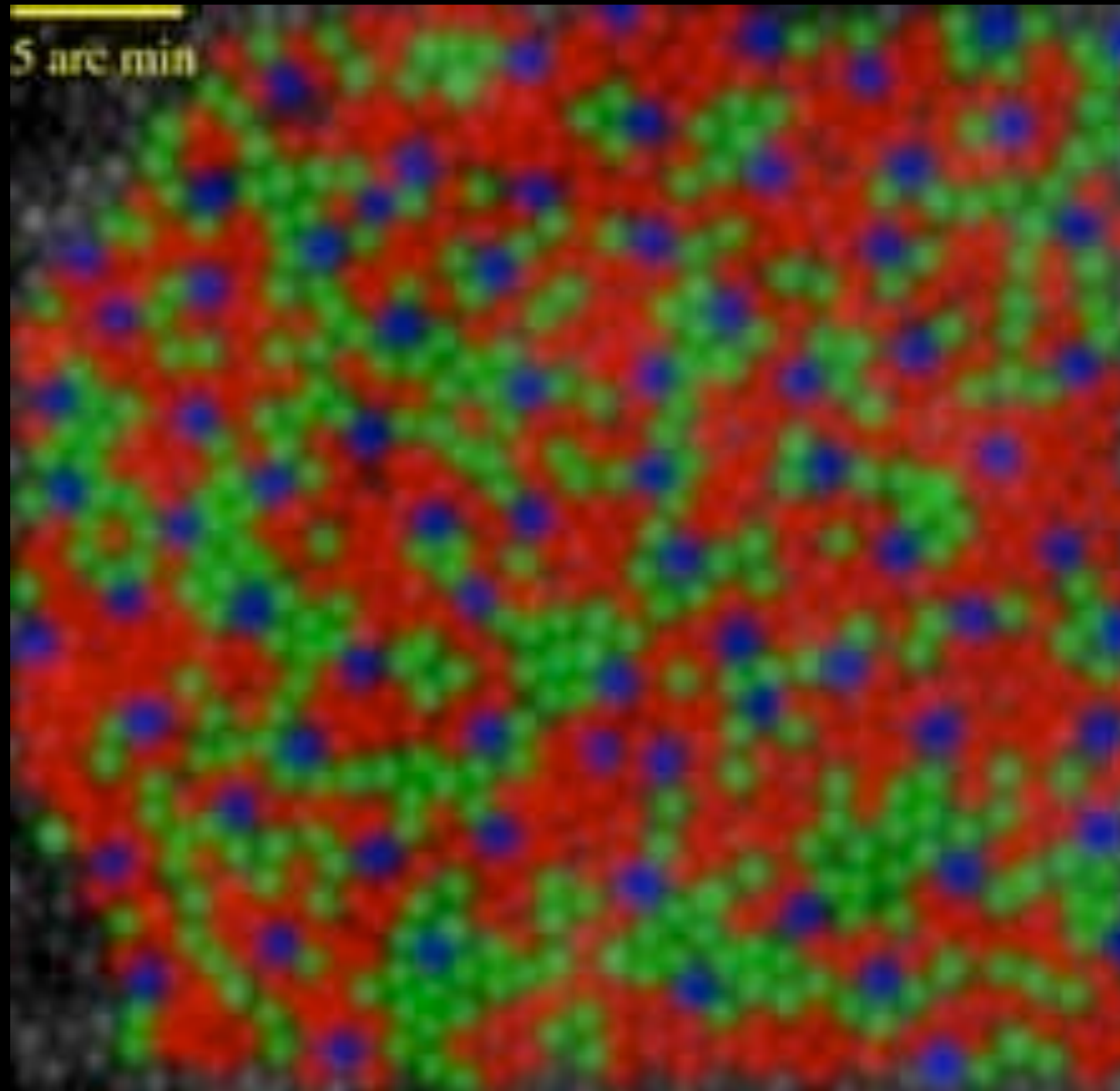
Austin  
Roorda



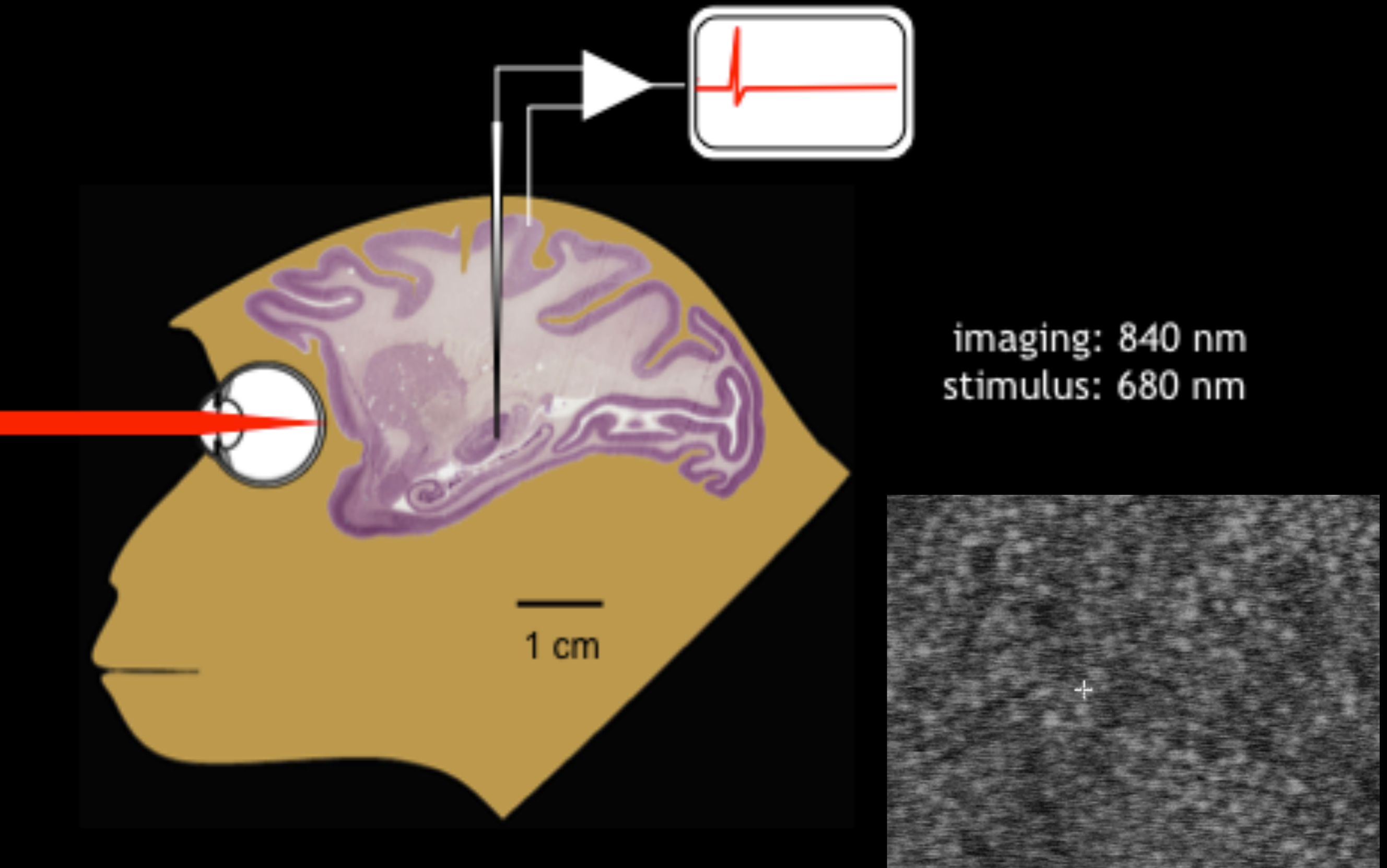
© Austin Roorda 



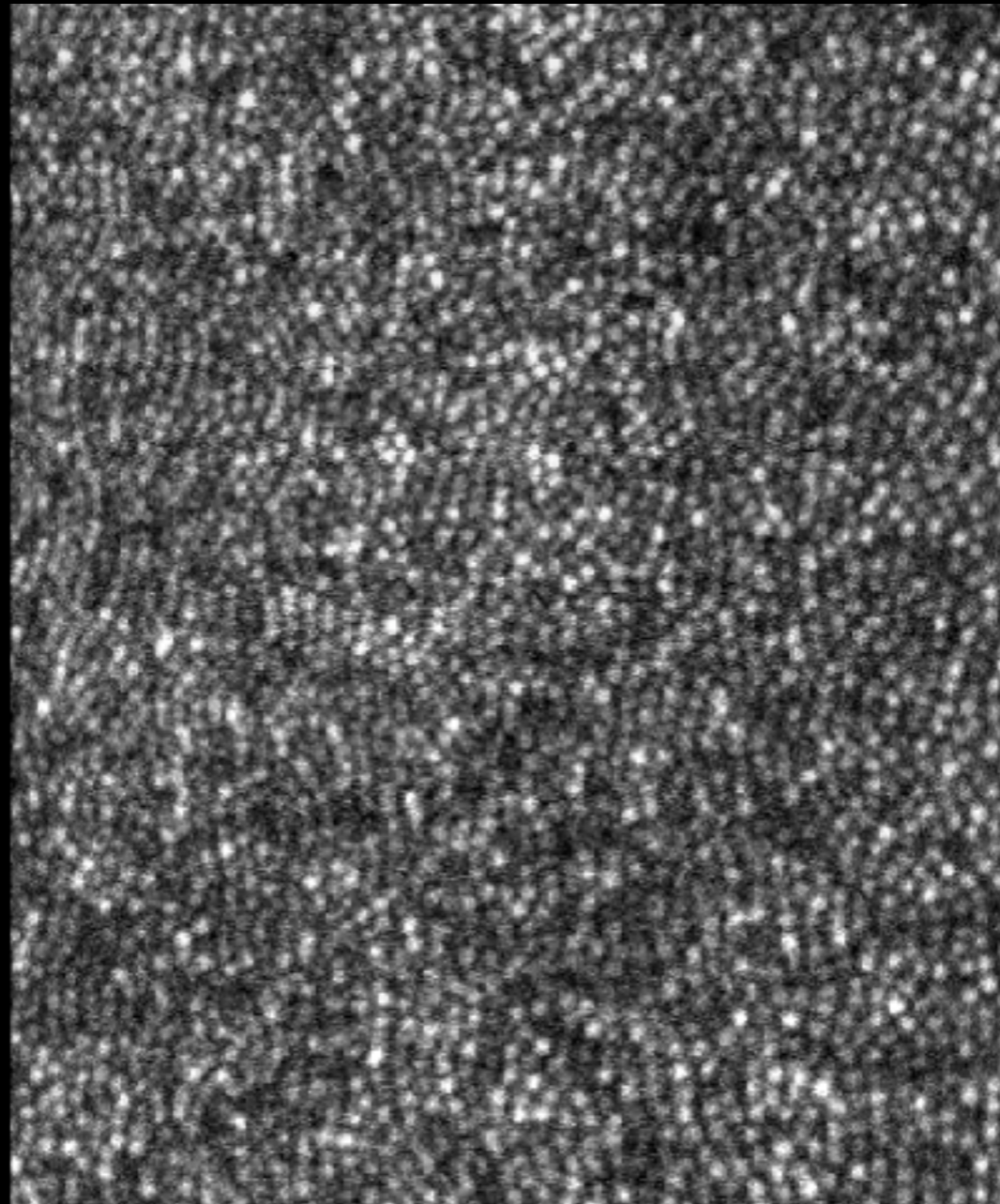
# Human retina - cone mosaic



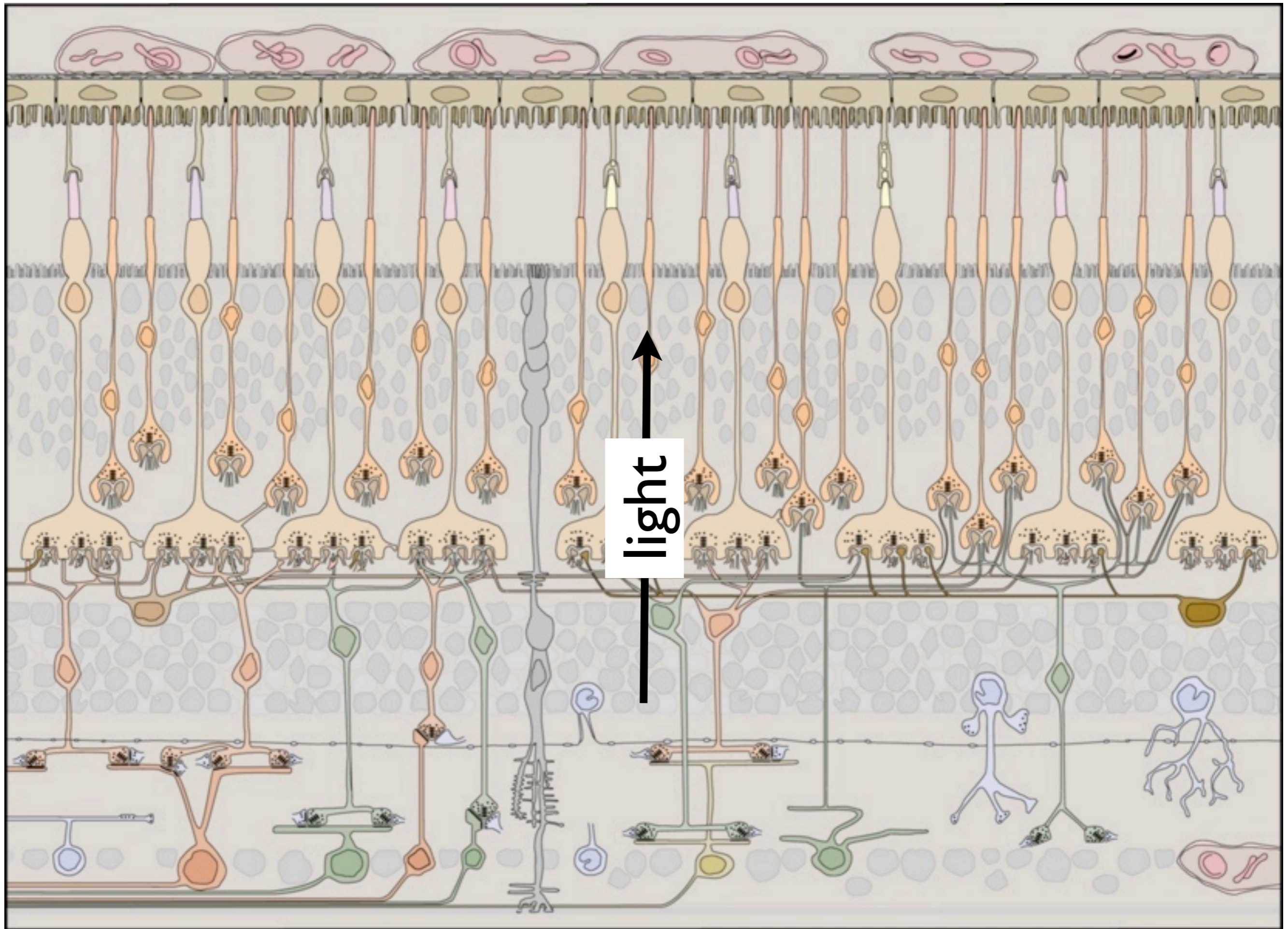
# Combined Stimulus Delivery and Electrophysiology



# Human fixational eye movements (Austin Roorda, UCB)

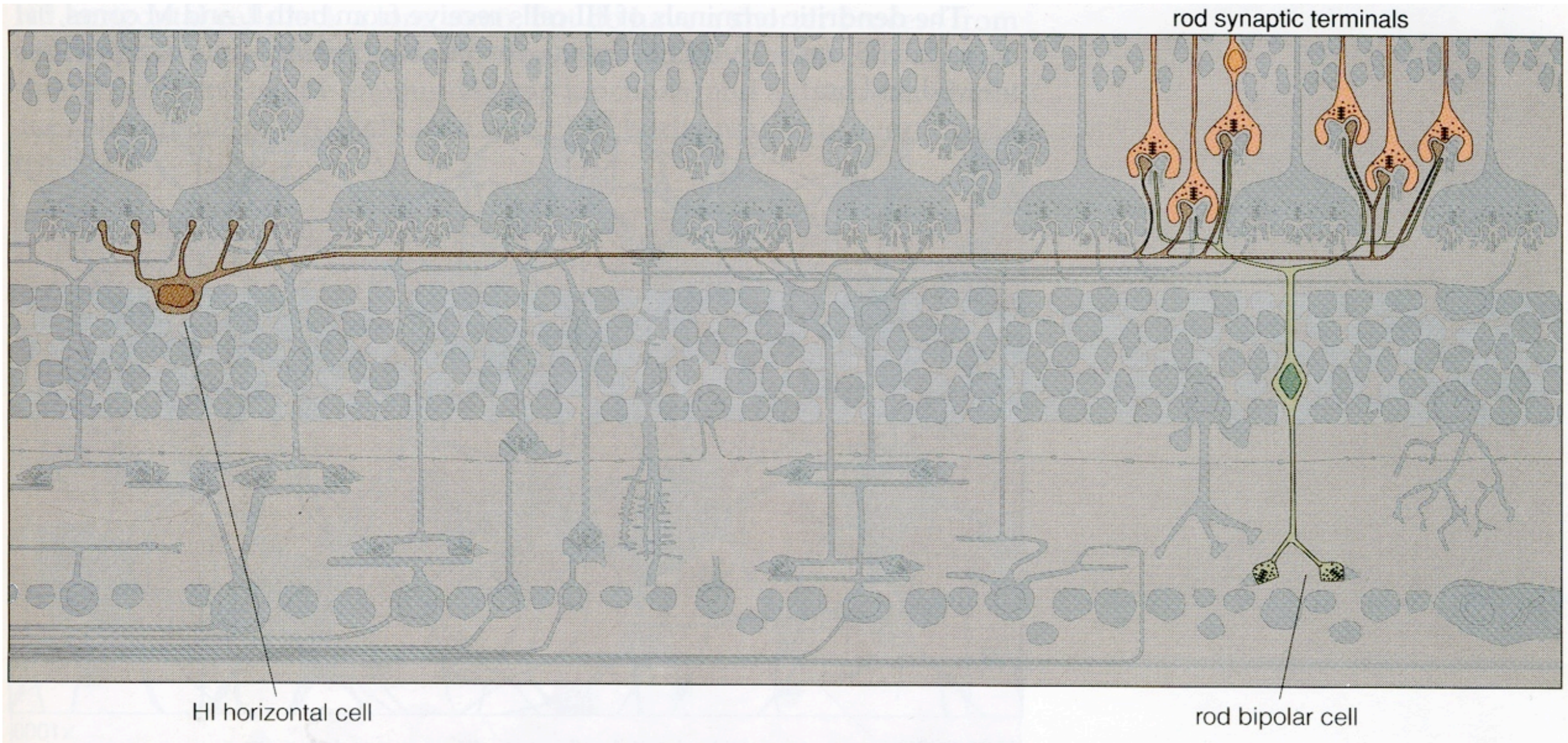






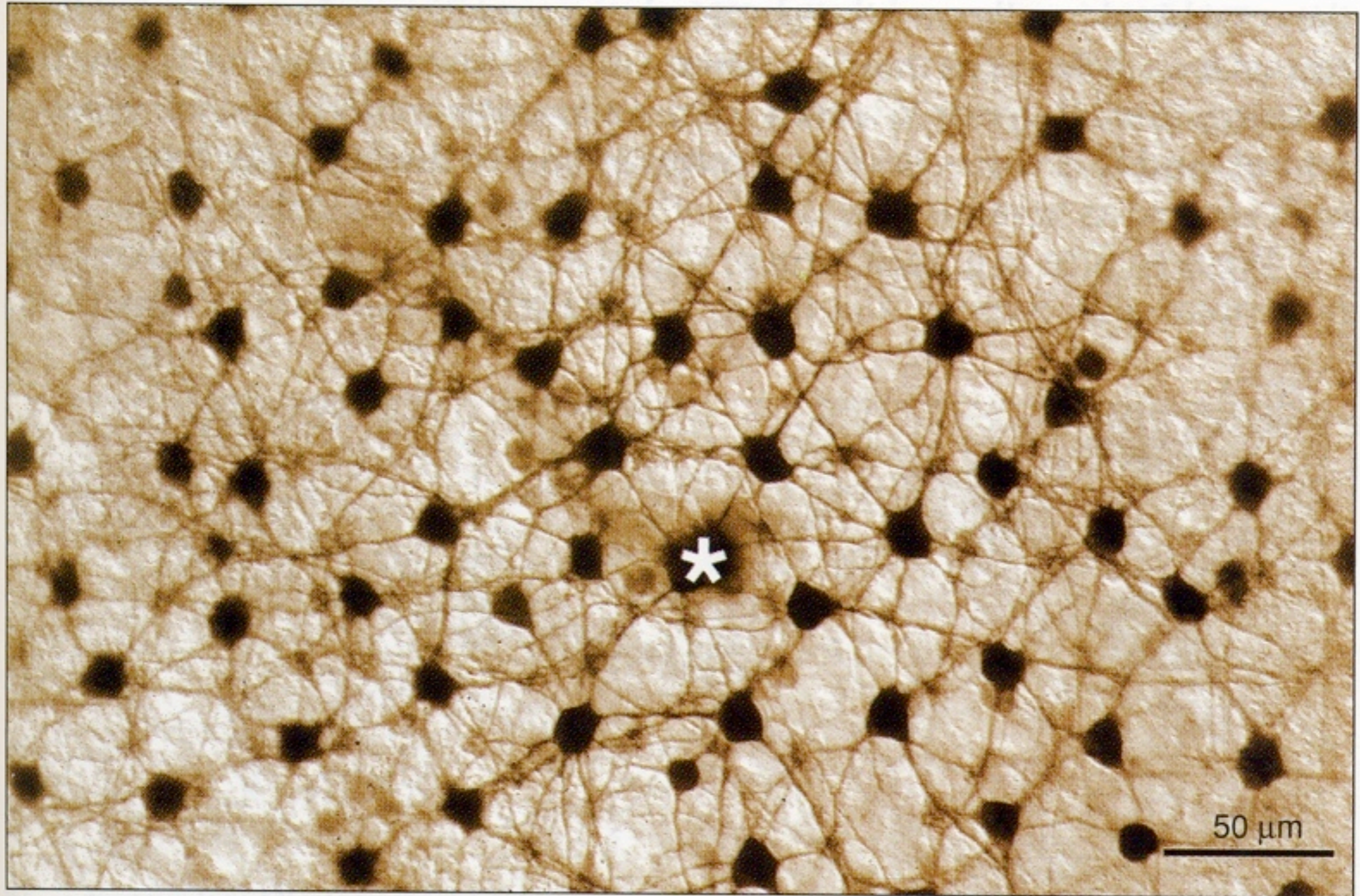


# HI horizontal cell





# HI horizontal cells connected via gap junctions



HI horizontal cells labeled following injection of one HI cell (\*)

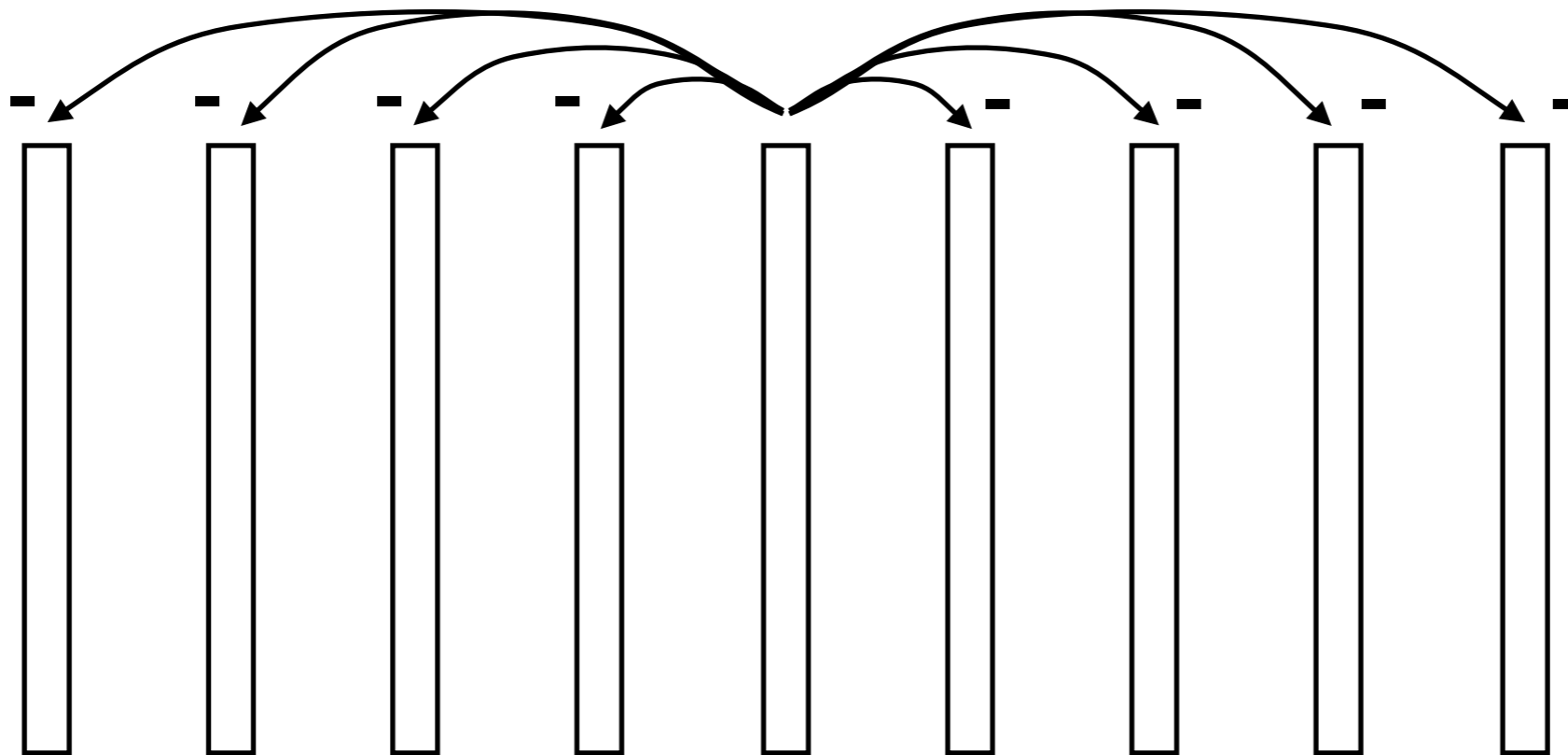
×300

after Dacey, Lee, and Stafford, 1996

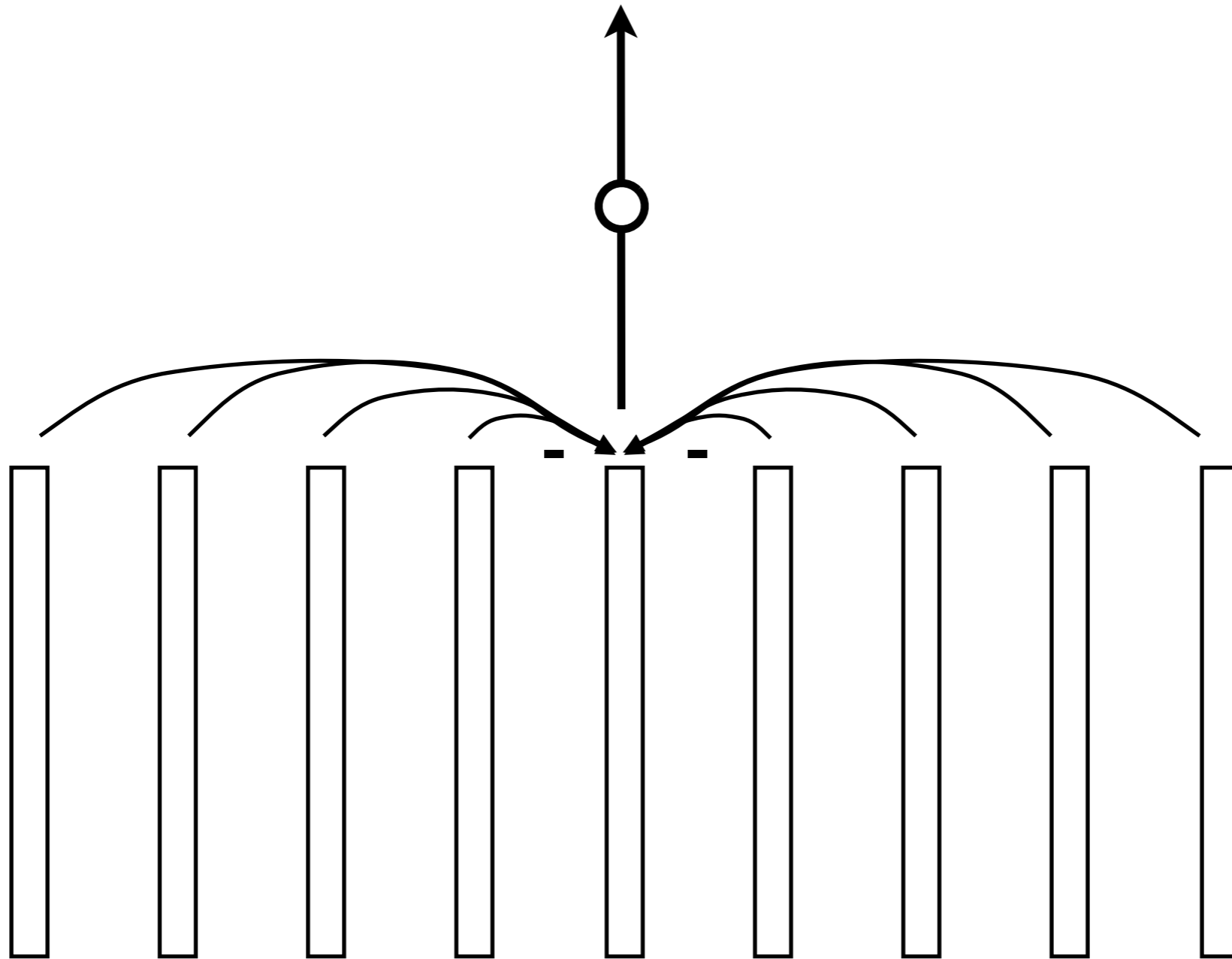


# Lateral inhibition:

activation of one photoreceptor inhibits neighboring photoreceptors



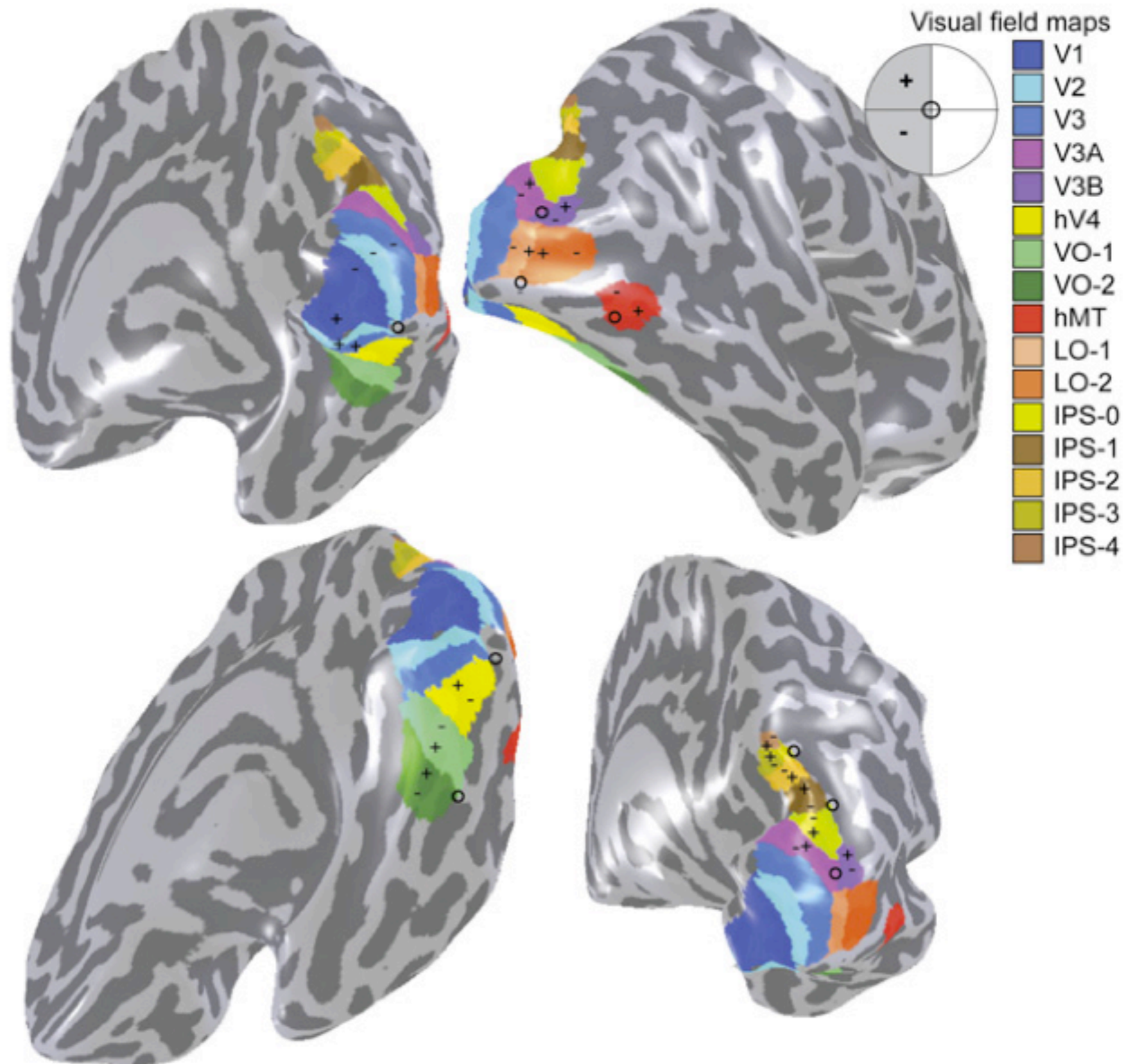
Bipolar cells read out **differences** between one photoreceptor's activity and its neighbors as computed by horizontal cell network





# Human visual cortex

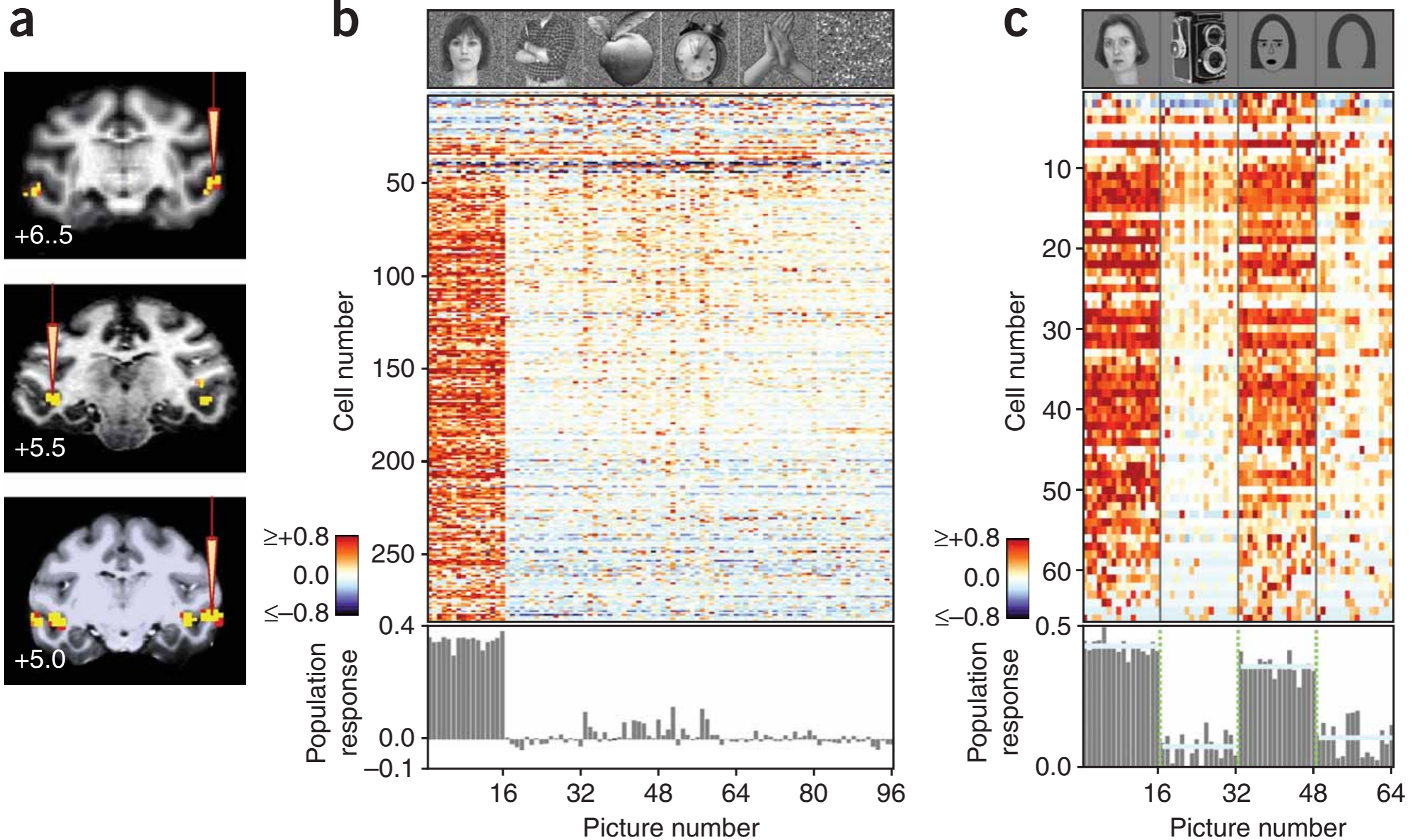
(Wandell, Dumoulin, & Brewer, 2007)



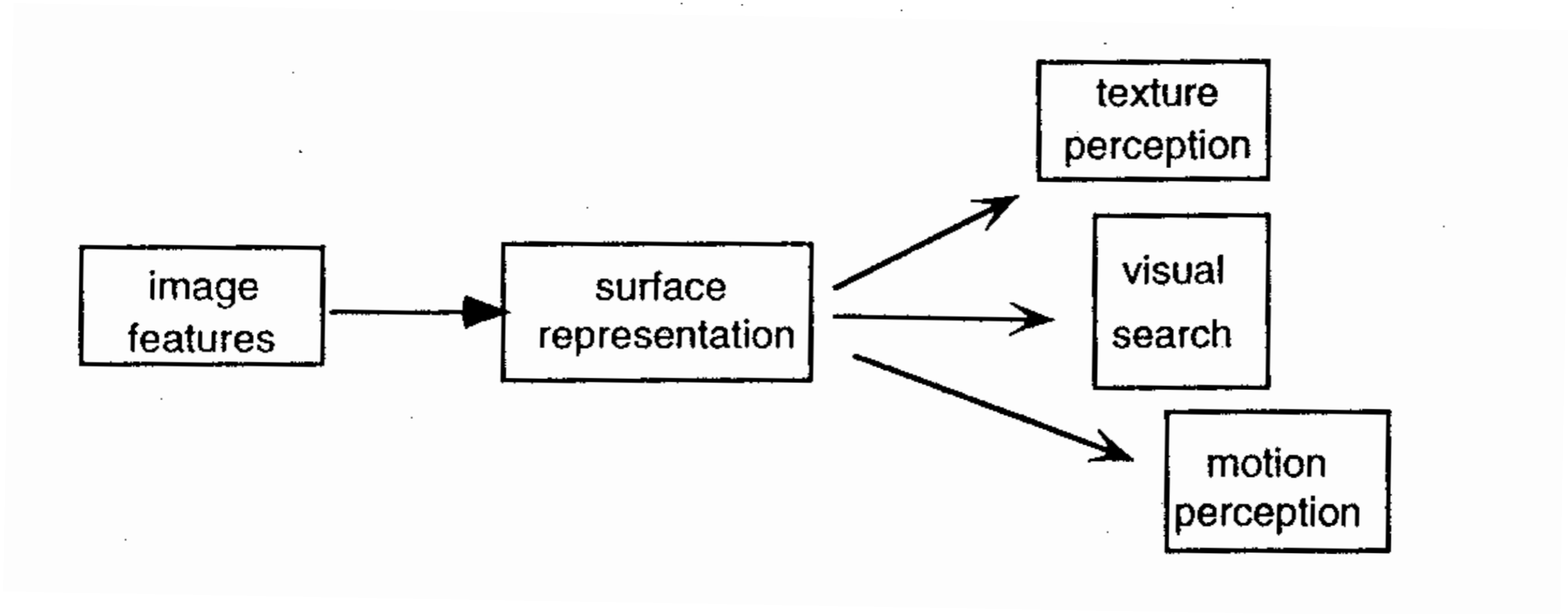


# Face feature spaces

(Freiwald, Tsao & Livingstone 2009)

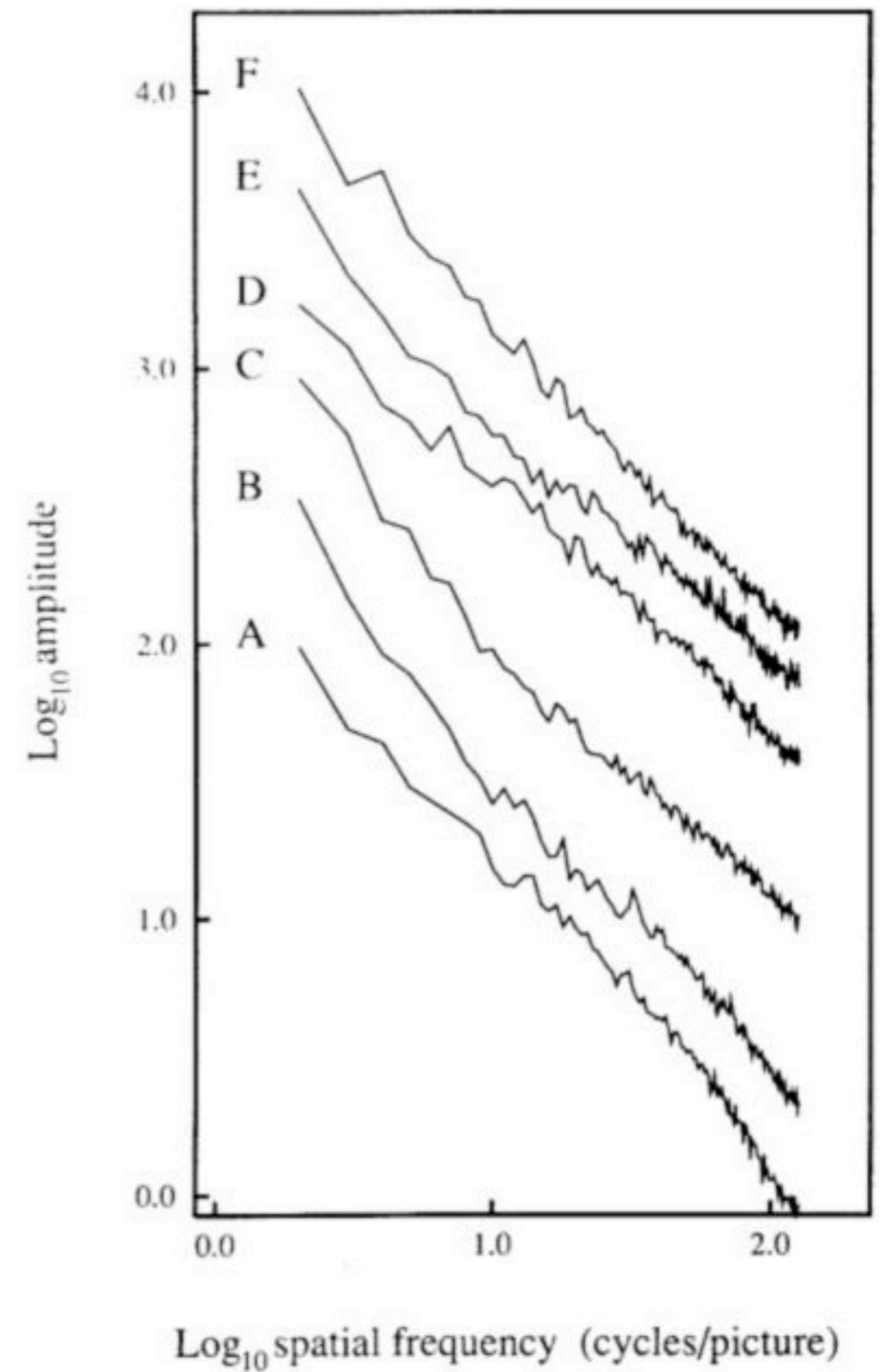
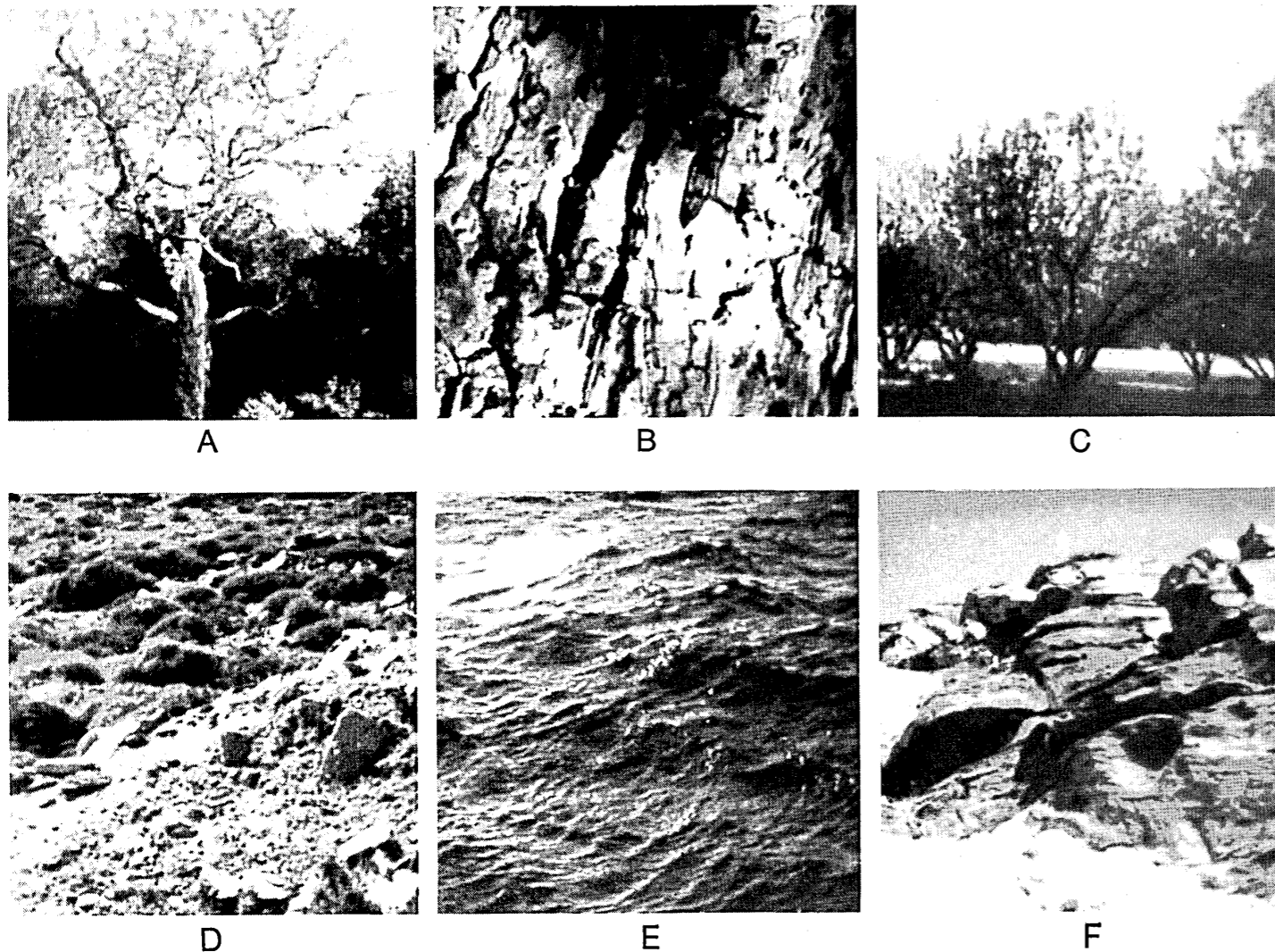


# Intermediate-level vision



(Nakayama, He & Shimojo 1995)

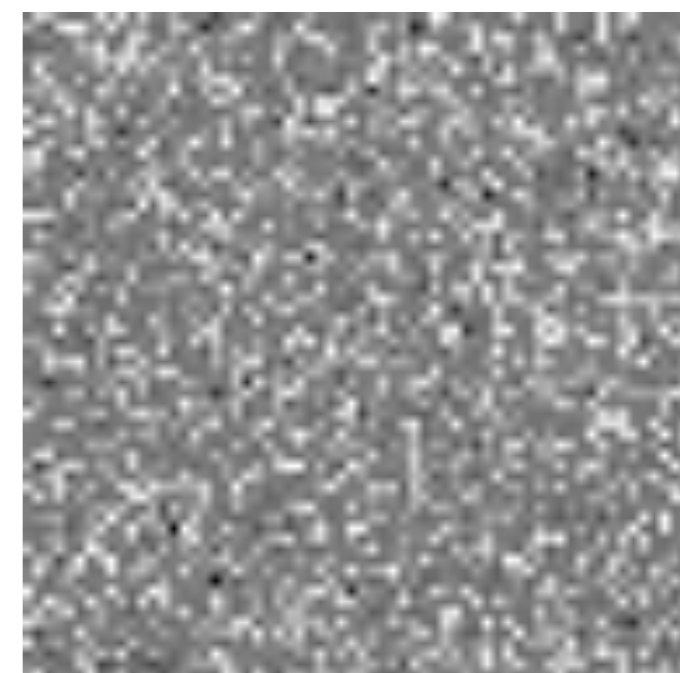
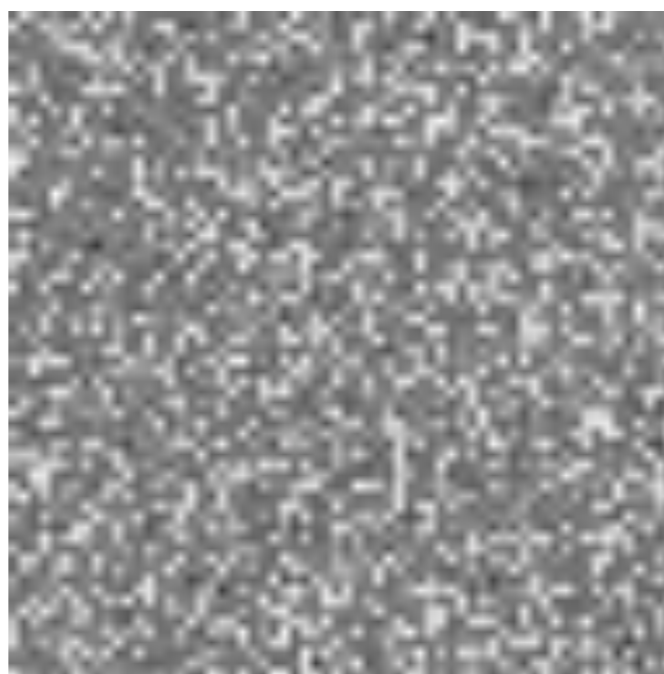
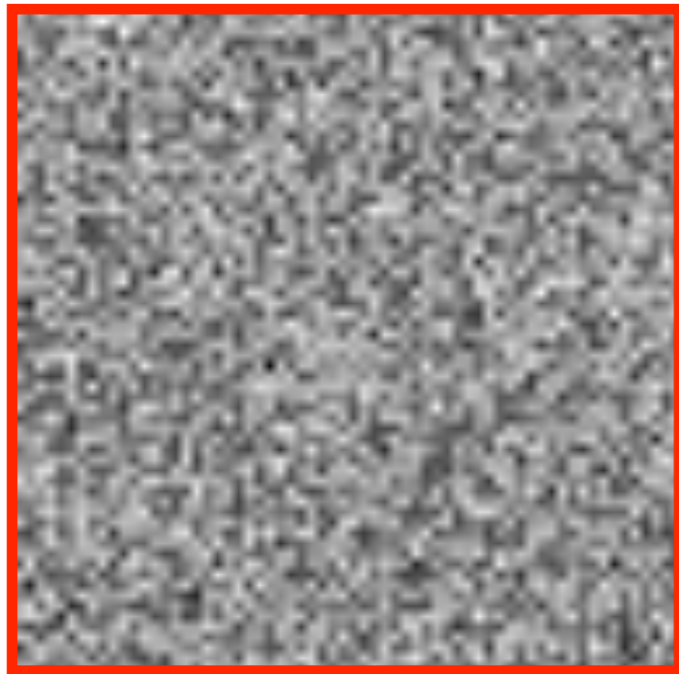
# Natural scene statistics and visual coding



(Field 1987)



# Which two images are the same?



# Which two images are the same?

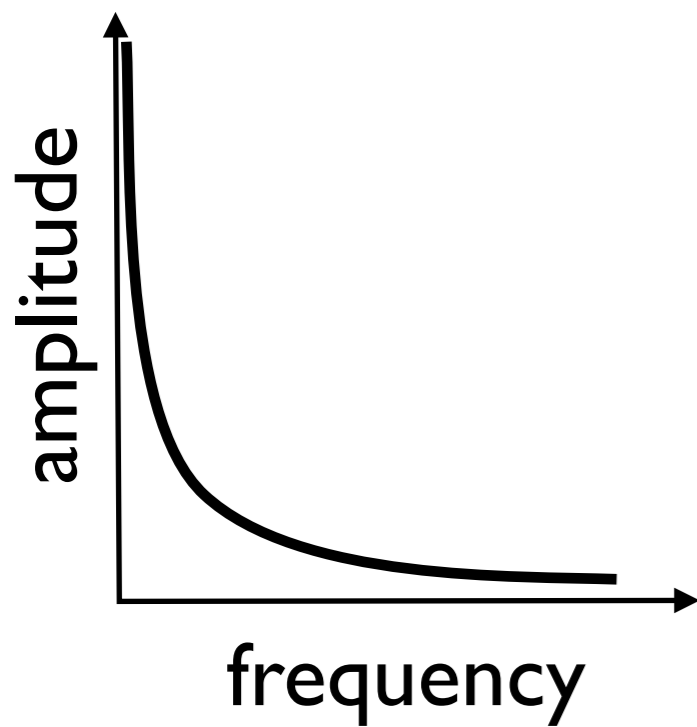


# Whitening (or decorrelation) theory (Atick & Redlich, 1992)

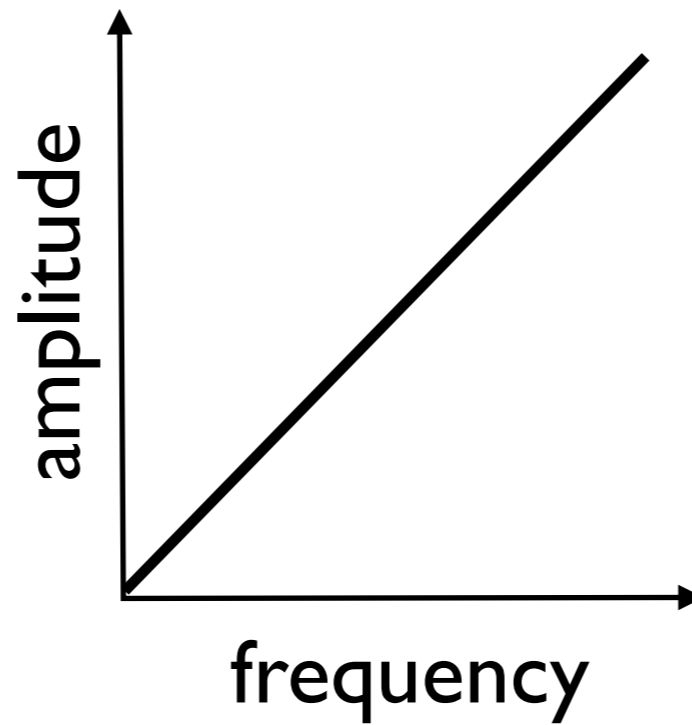
1/f image

whitening filter

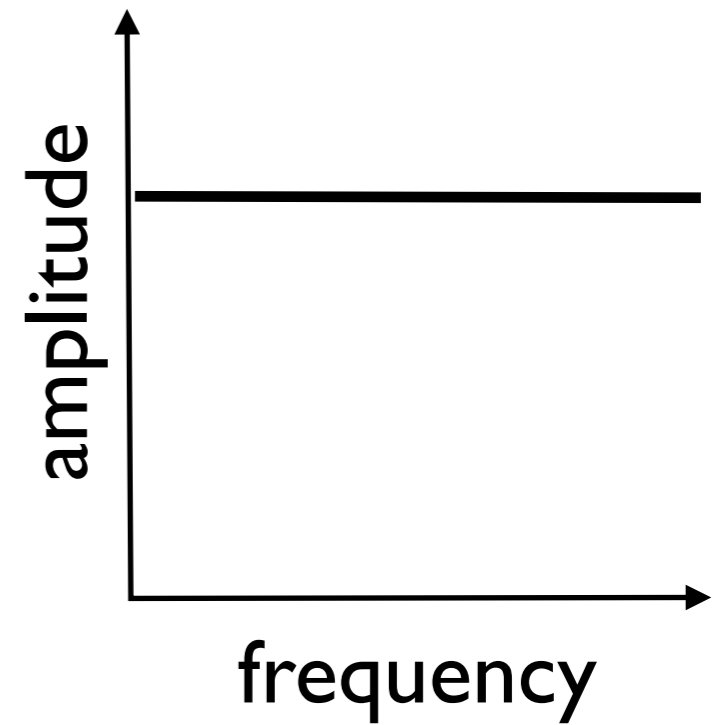
decorrelated image



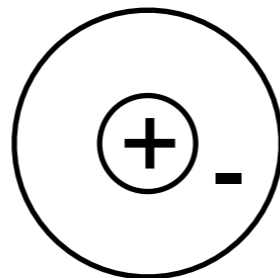
x



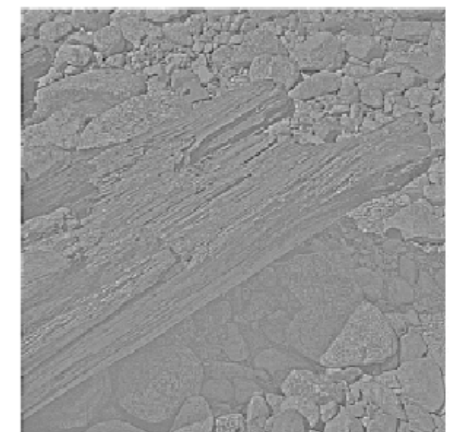
=



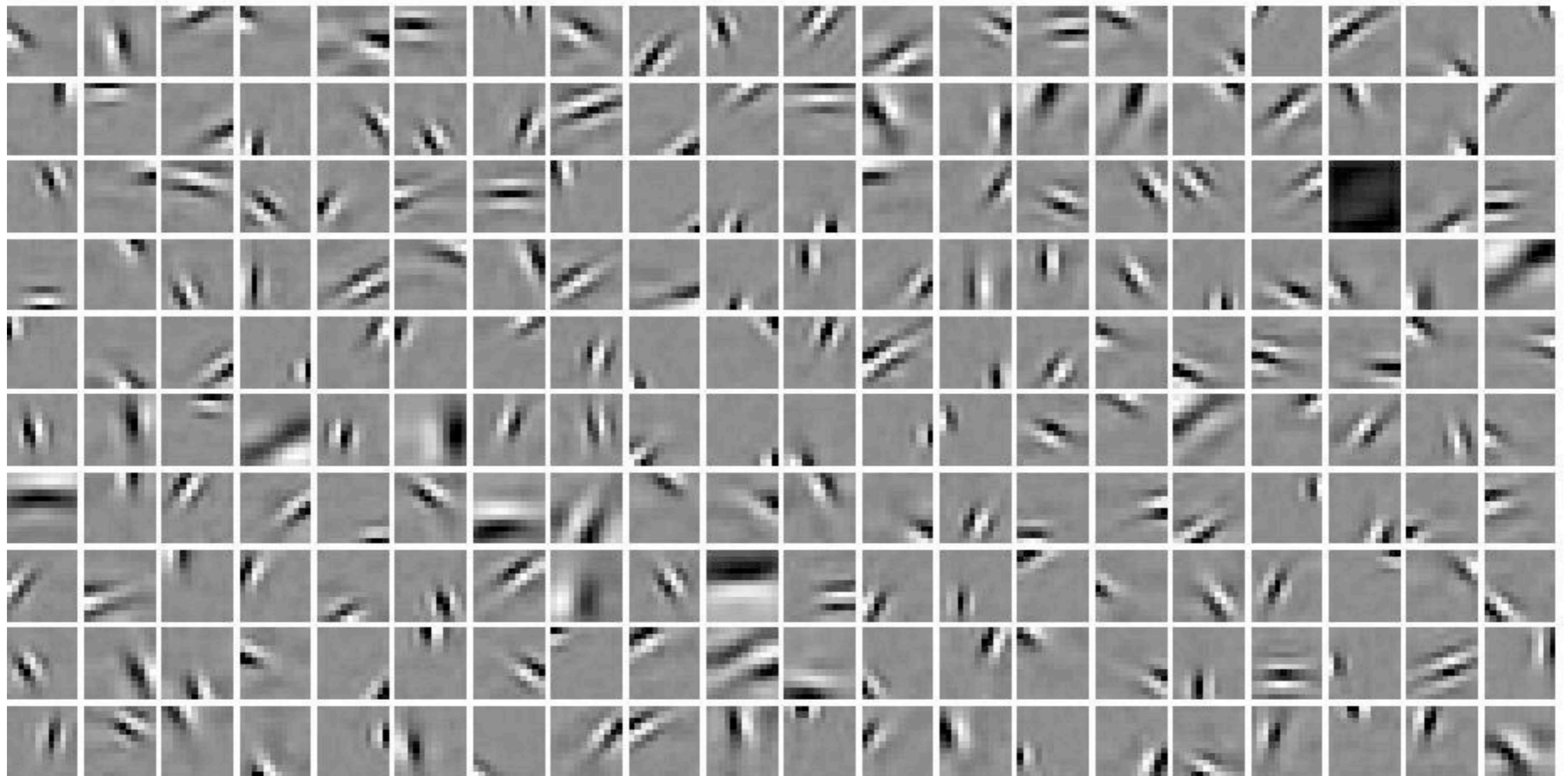
\*



=



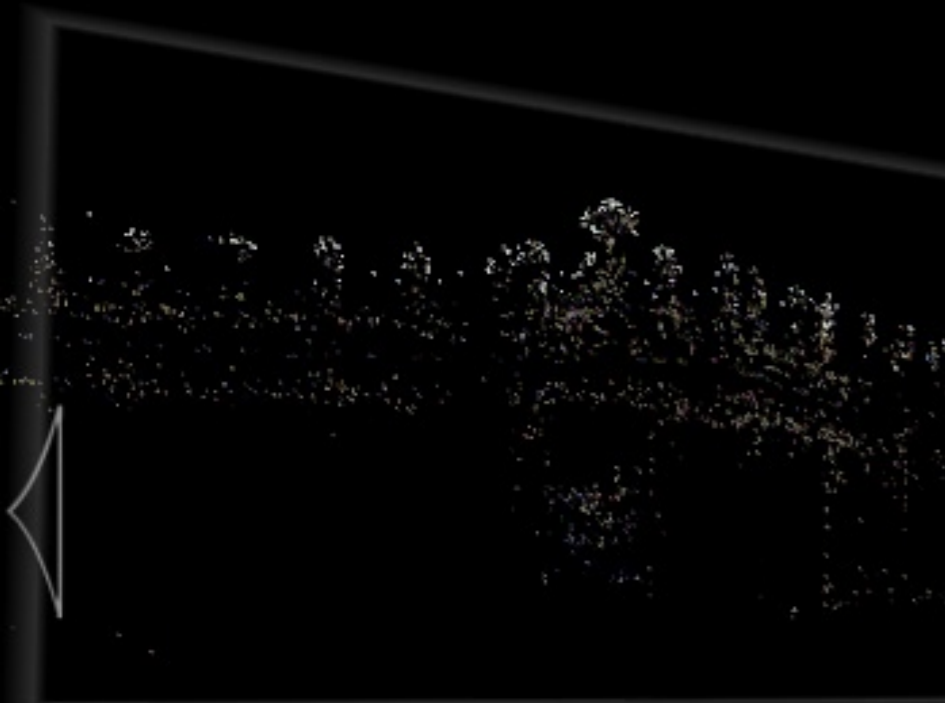
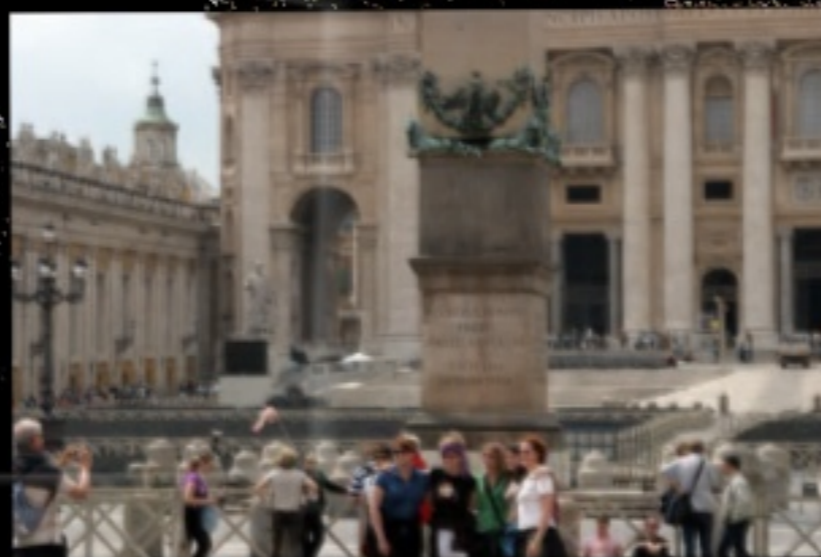
# Features learned from sparse coding of natural images resemble V1 simple cell receptive fields (Olshausen & Field 1996)





<b>statistics</b>	<b>coding strategy</b>	<b>neurobiological substrate</b>
contrast histogram	histogram equalization	photoreceptors/ bipolar cells
autocorrelation function	whitening	retina/LGN
sparse components	localized, oriented, bandpass feature decomposition	V1 'simple cells'
amplitude components	texture coding	V1/V2 'complex cells'
phase components	motion coding	MT

# Computer vision - multiple view geometry





# Mysteries

Tiny nervous systems

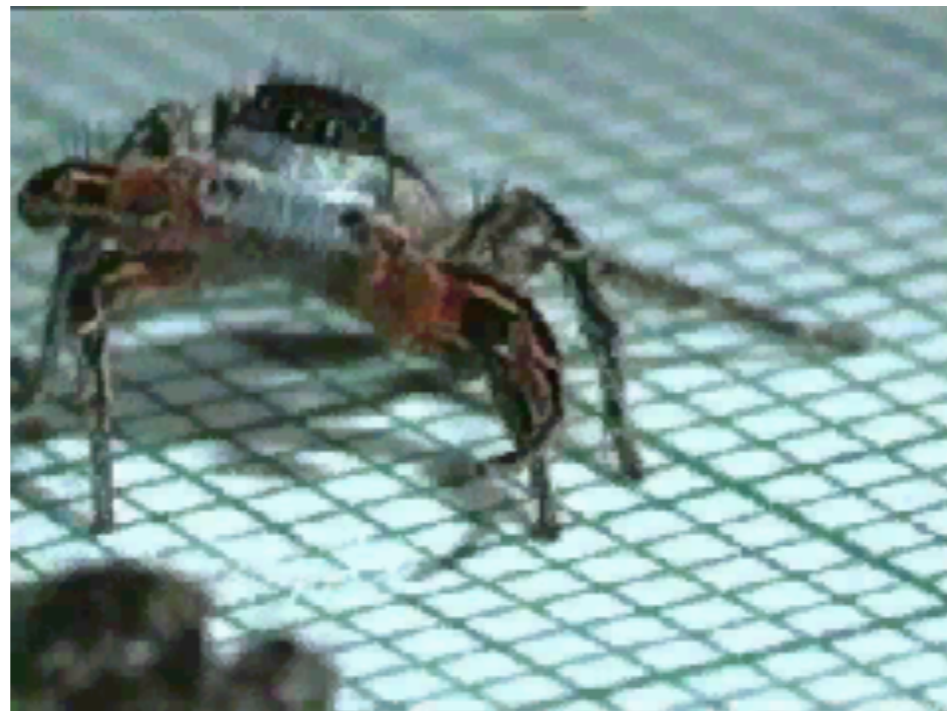
Neocortical microcircuit

Neuronal oscillations

Computer vision: action-perception loops



# Jumping spiders



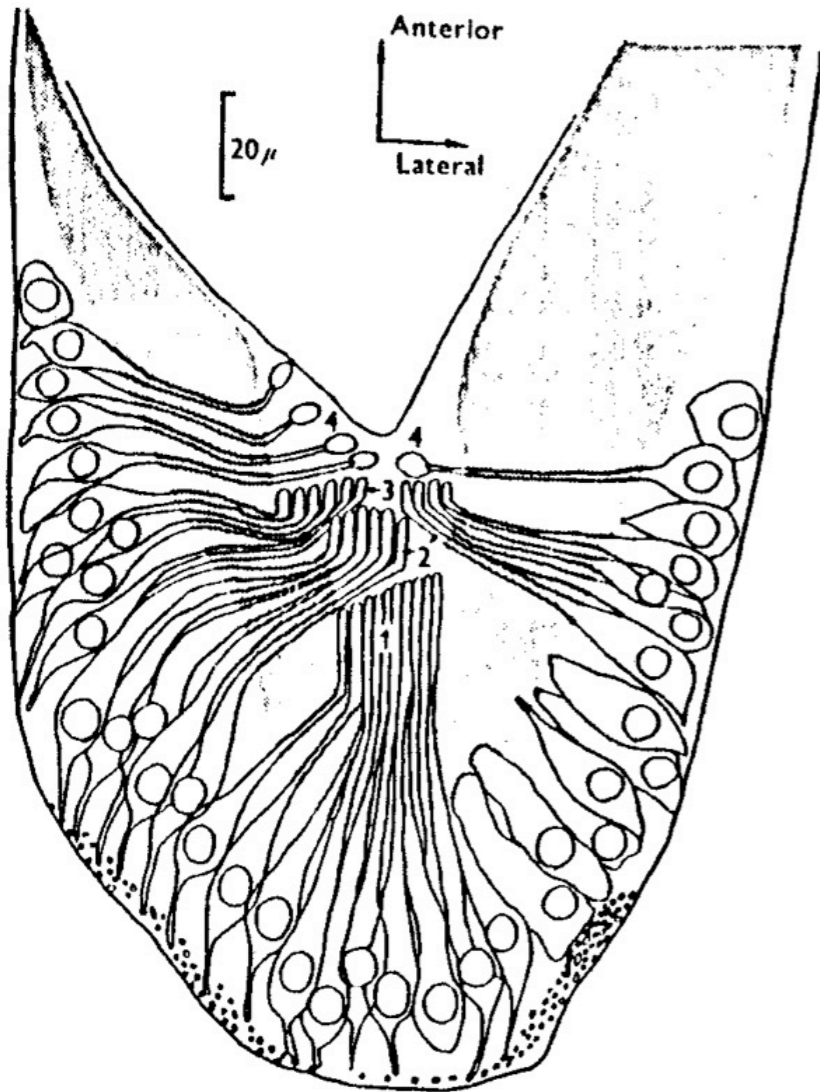
# Jumping spider visual system



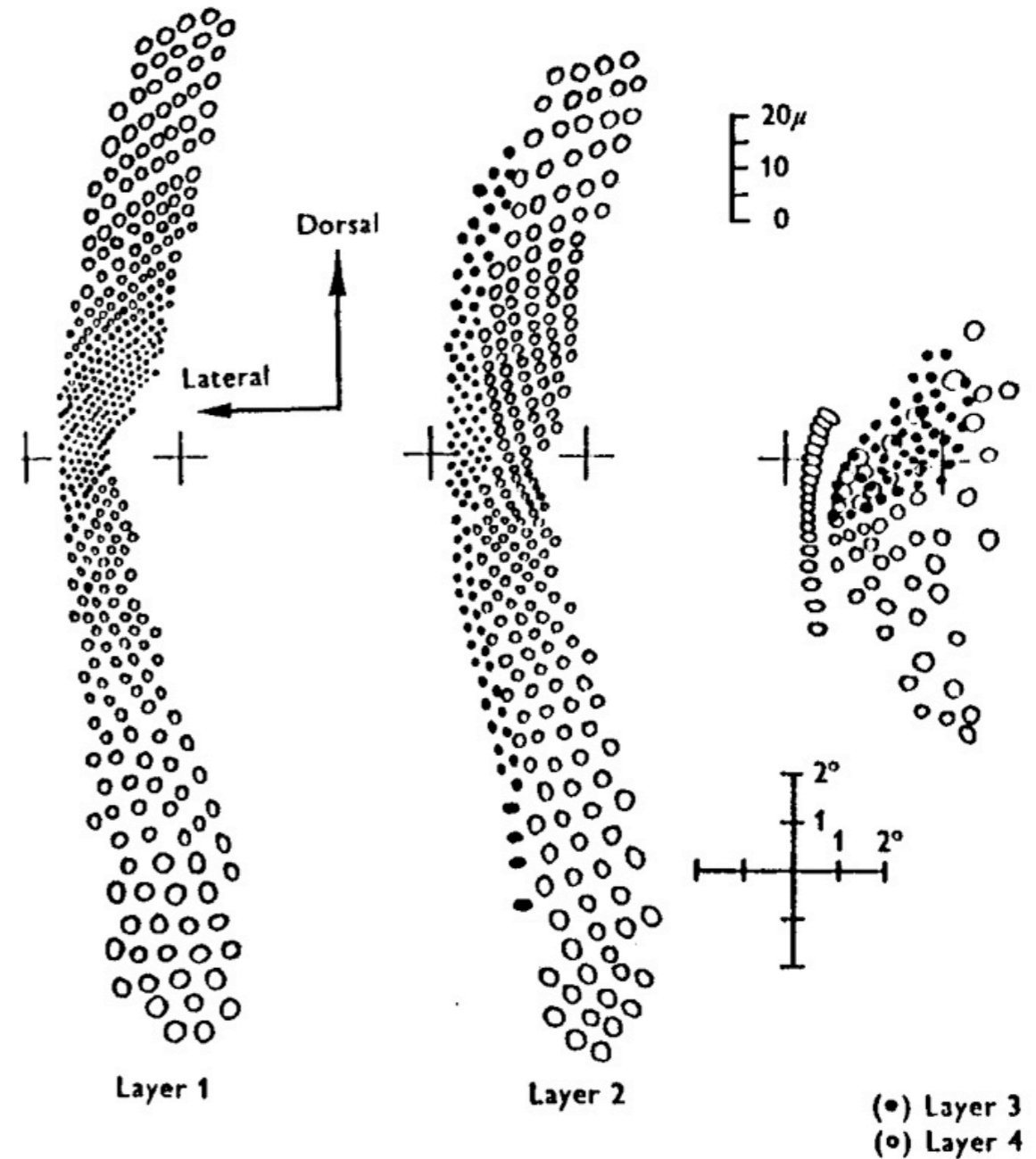


# Jumping spider retina

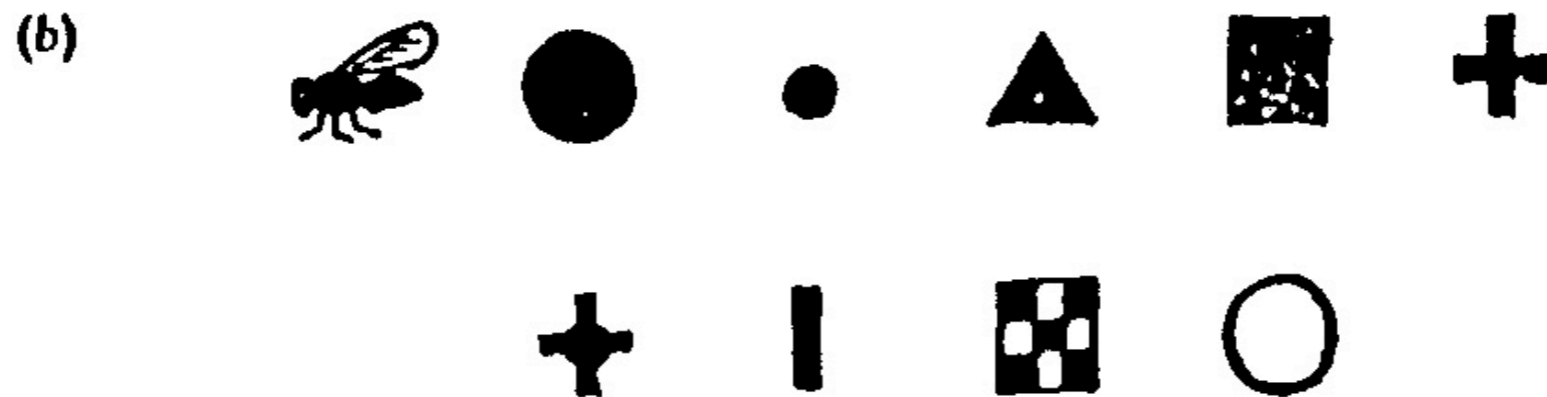
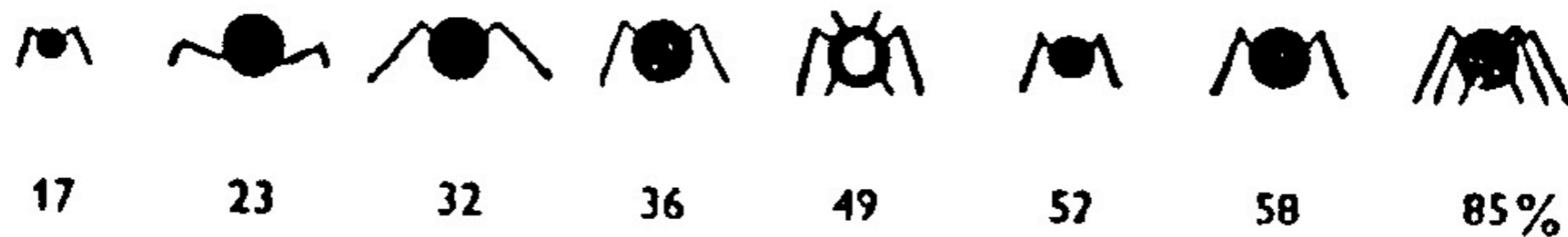
horizontal section



photoreceptor array



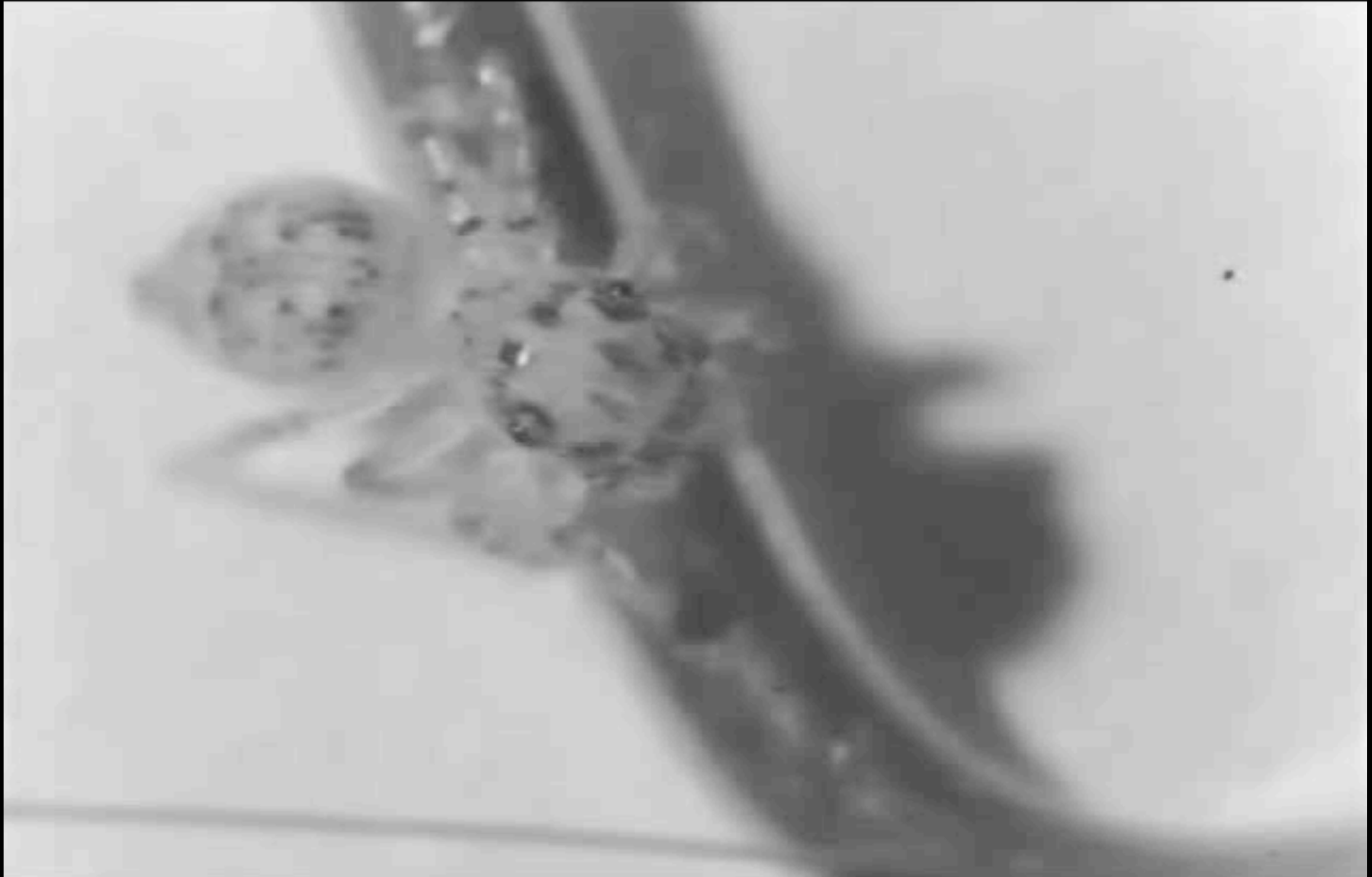
# Jumping spiders do object recognition



Text-fig. 12. Stimuli found by Drees to evoke courtship (a) and prey capture (b) in male jumping spiders (*Epiblemum scenicum*). The numbers beneath each figure in (a) are the percentage of trials on which courtship was evoked. After Drees (1952).



# One-day old jumping spider (filmed in the Bower lab, Caltech 1991)



One-day old jumping spider  
(filmed in the Bower lab, Caltech 1991)





# One-day old jumping spider (filmed in the Bower lab, Caltech 1991)

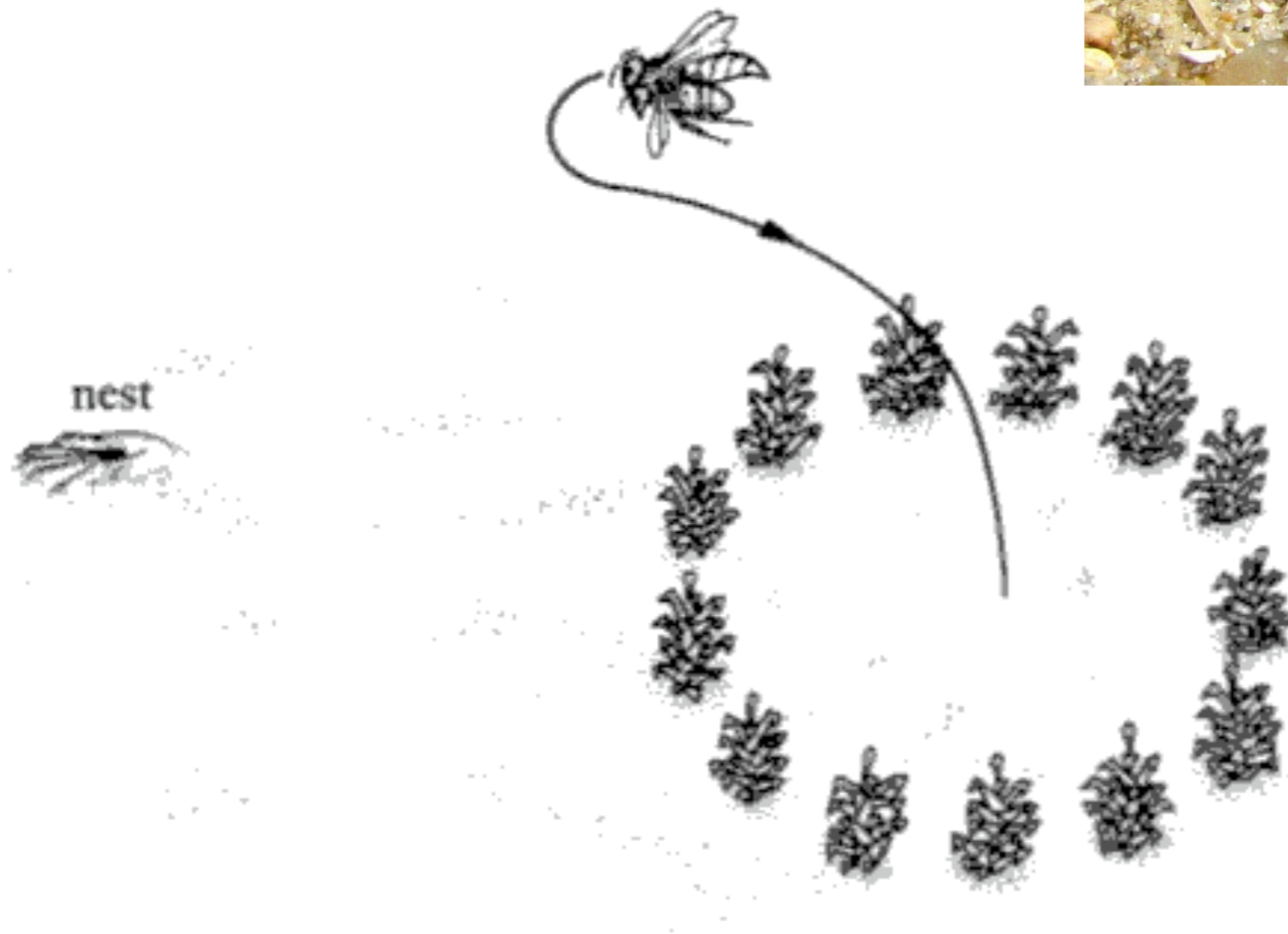


# One-day old jumping spider (filmed in the Bower lab, Caltech 1991)



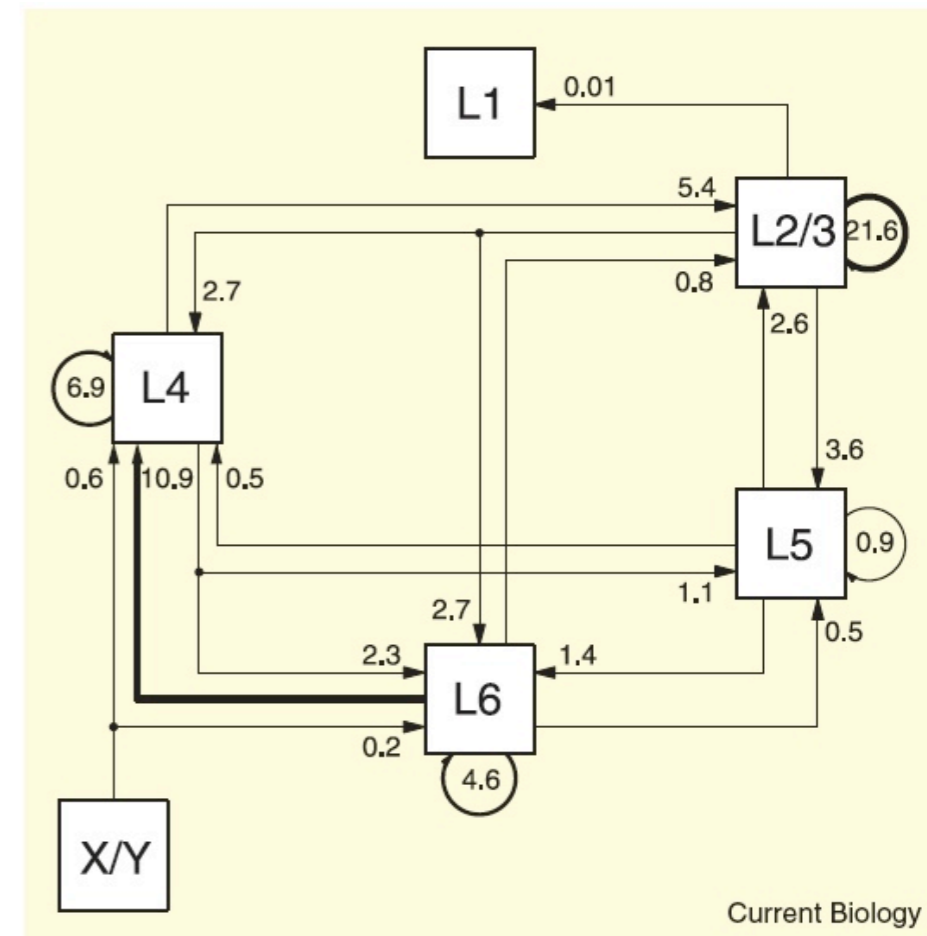
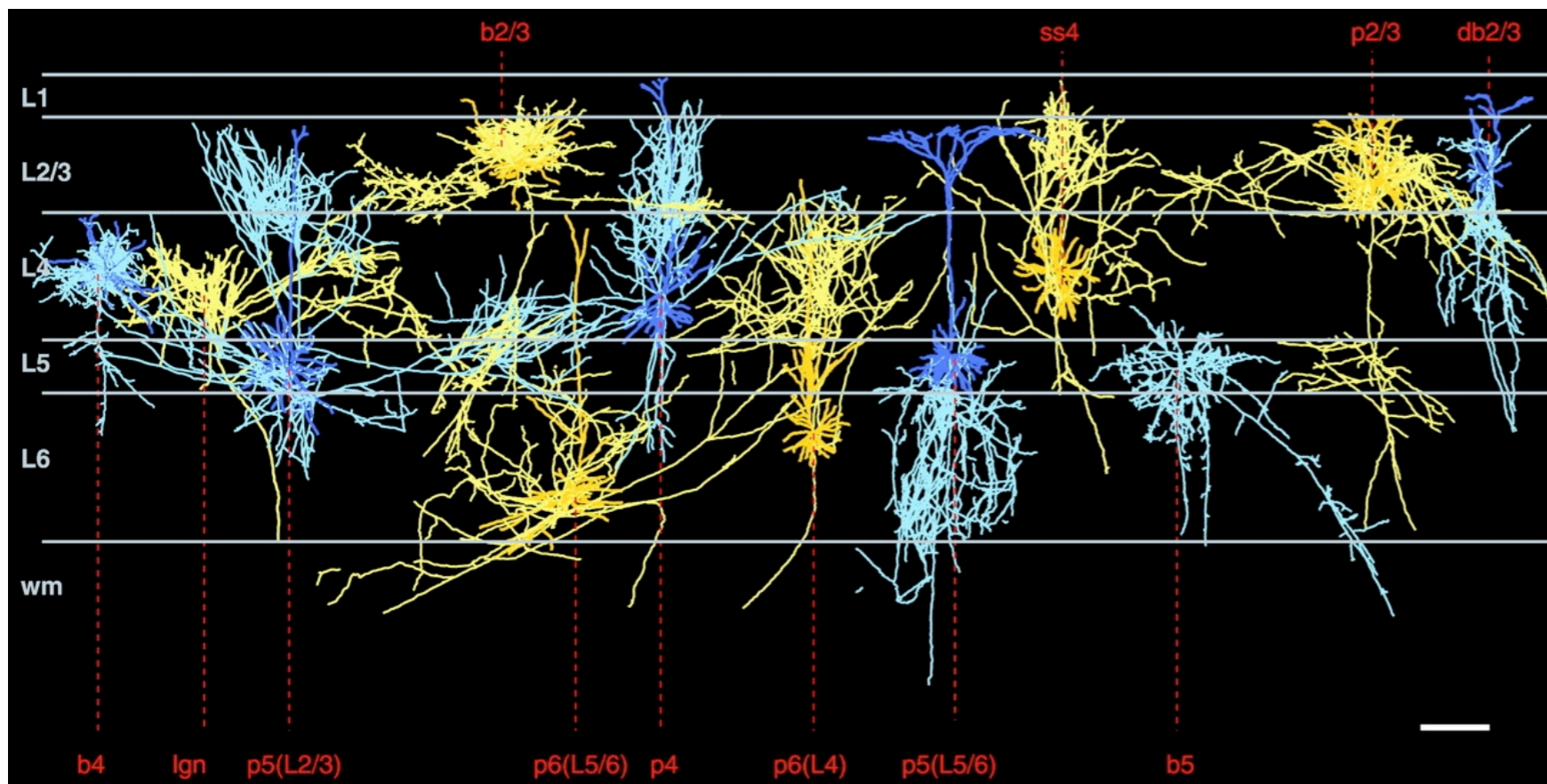


# Philanthus triangulum (sand wasp)



(See *Curious Naturalists*,  
by Niko Tinbergen)

# What is the function of the cortical microcircuit?



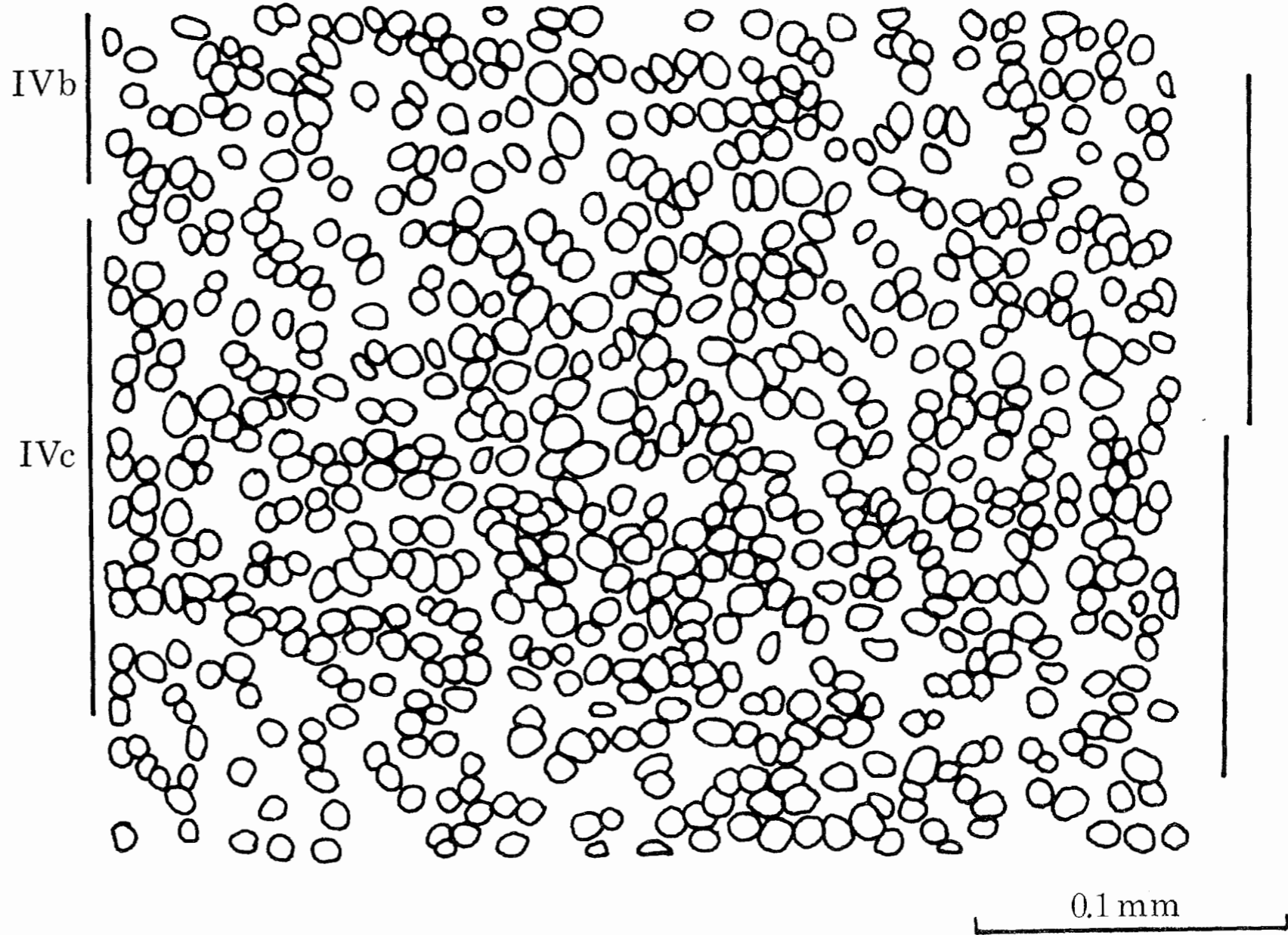


# VI is highly overcomplete

LGN  
afferents

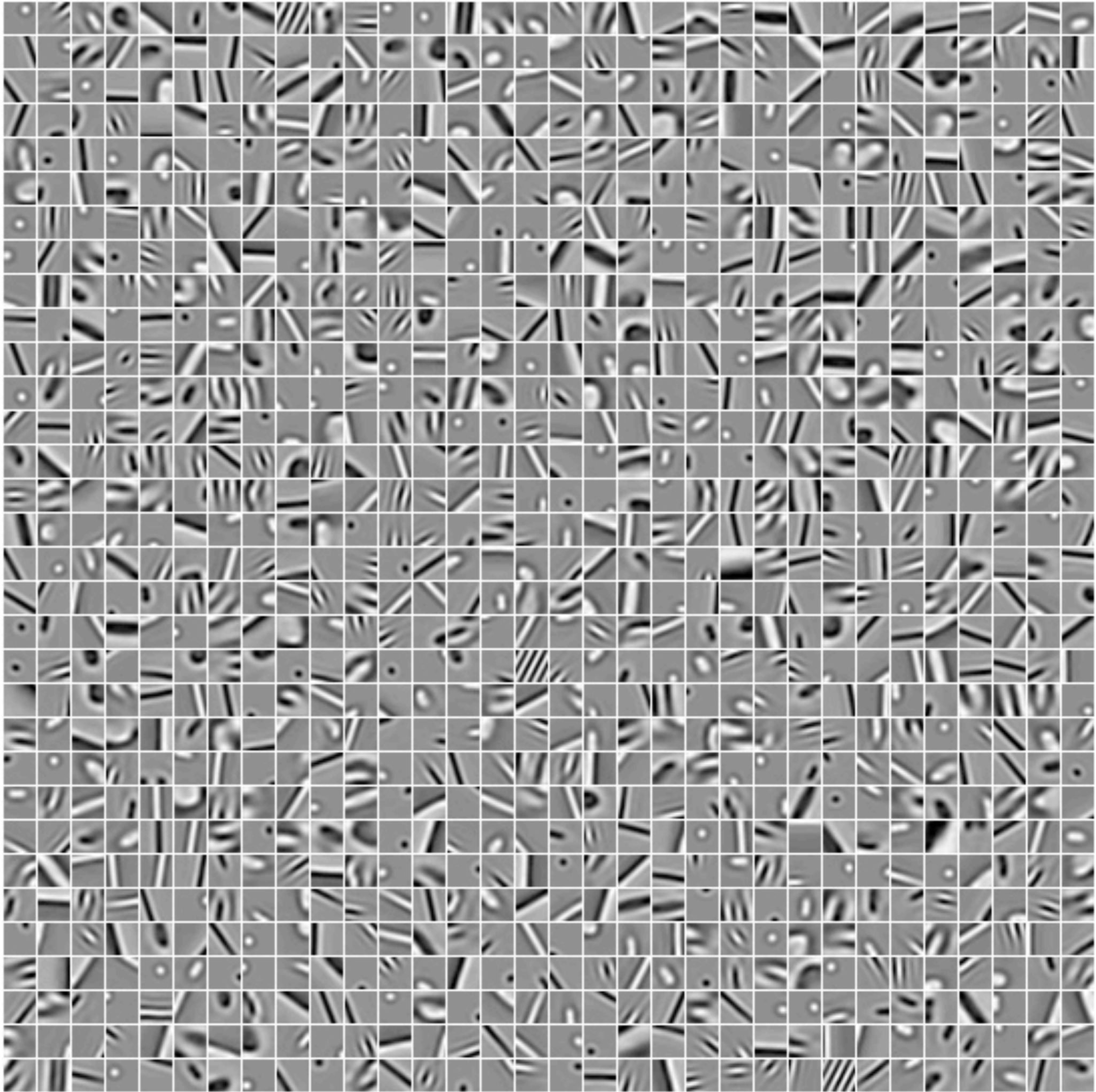


layer 4  
cortex



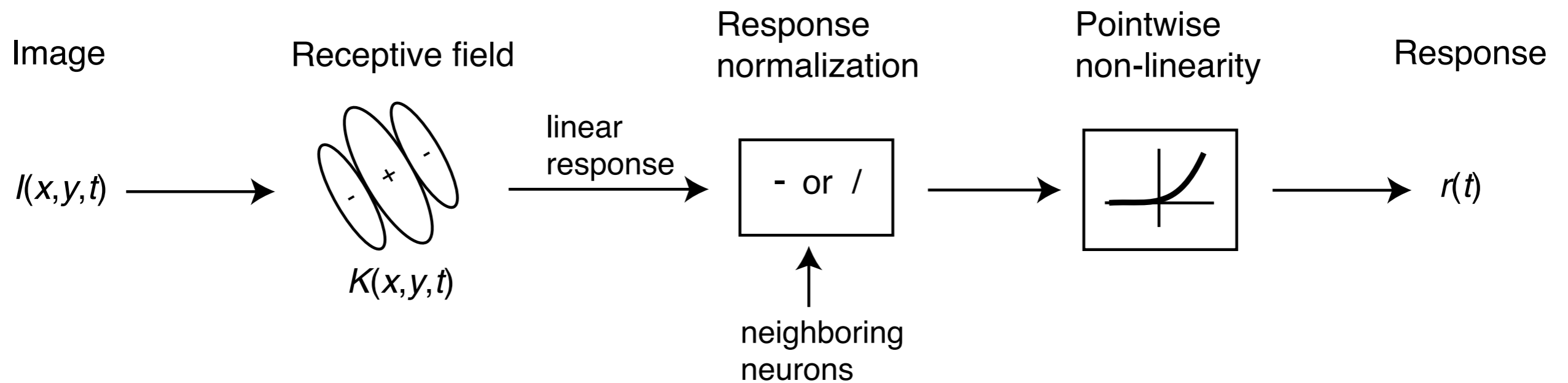
Barlow (1981)

Learned  
dictionary  
10x  
overcomplete

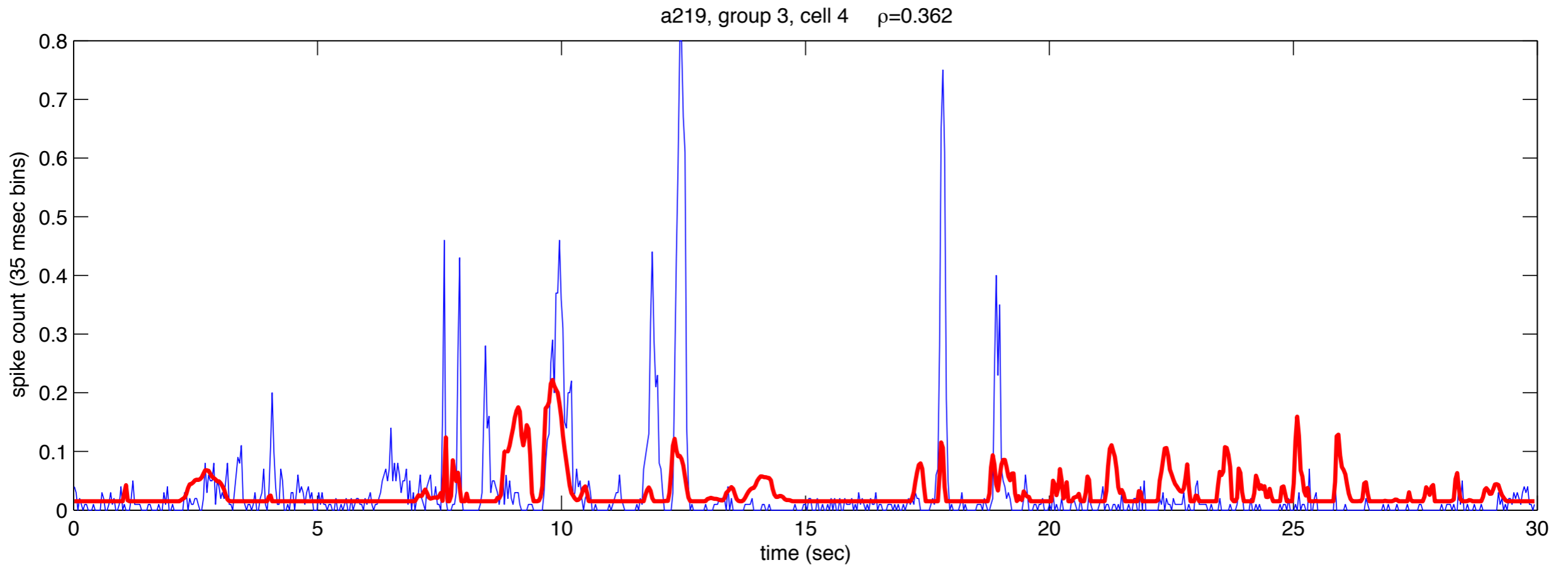
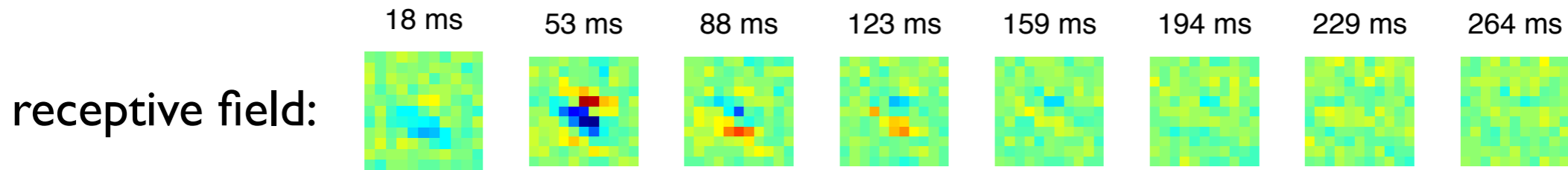




# The “standard model” of VI

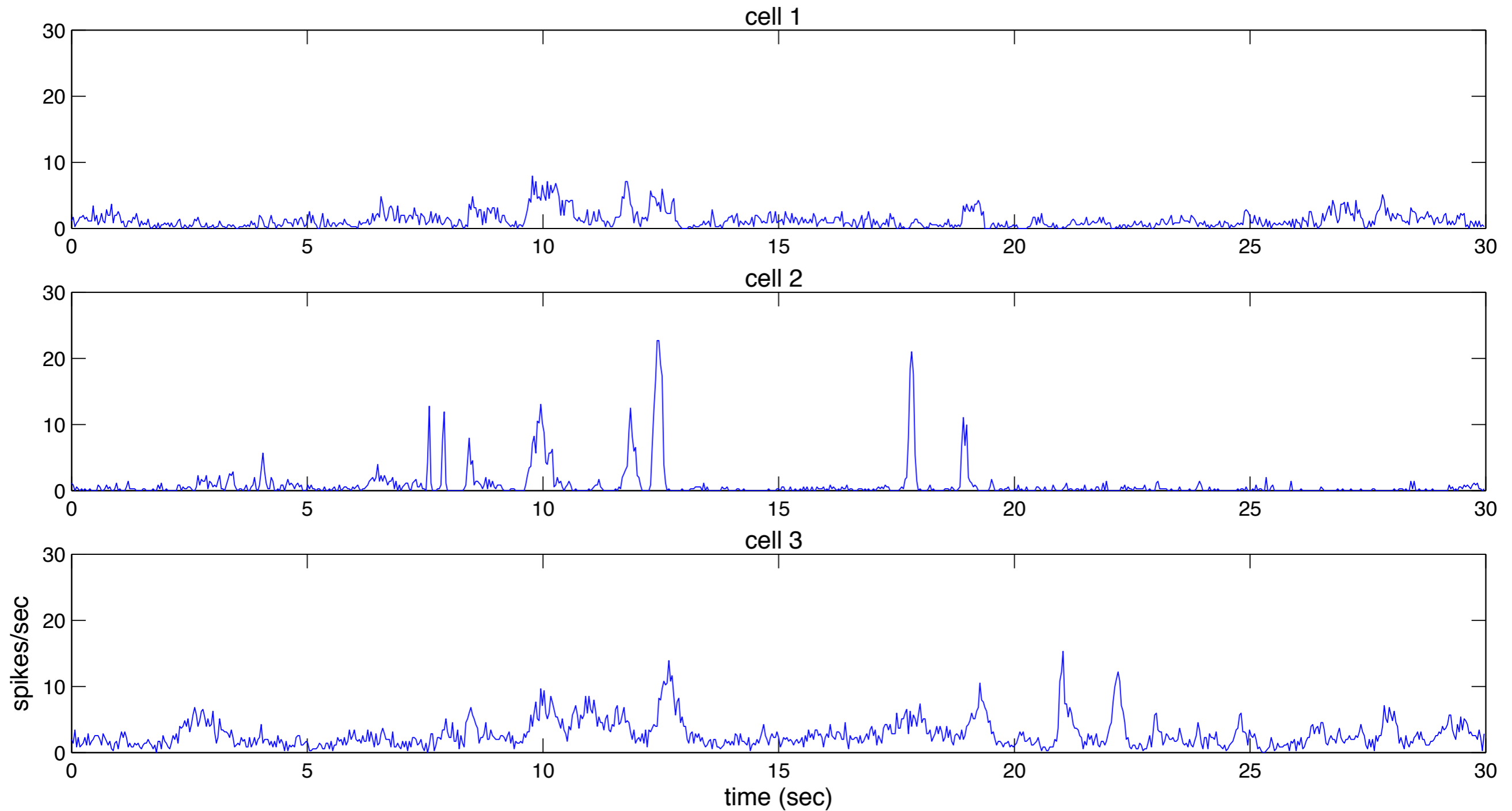


# Responses of VI neurons are not well predicted by RF models

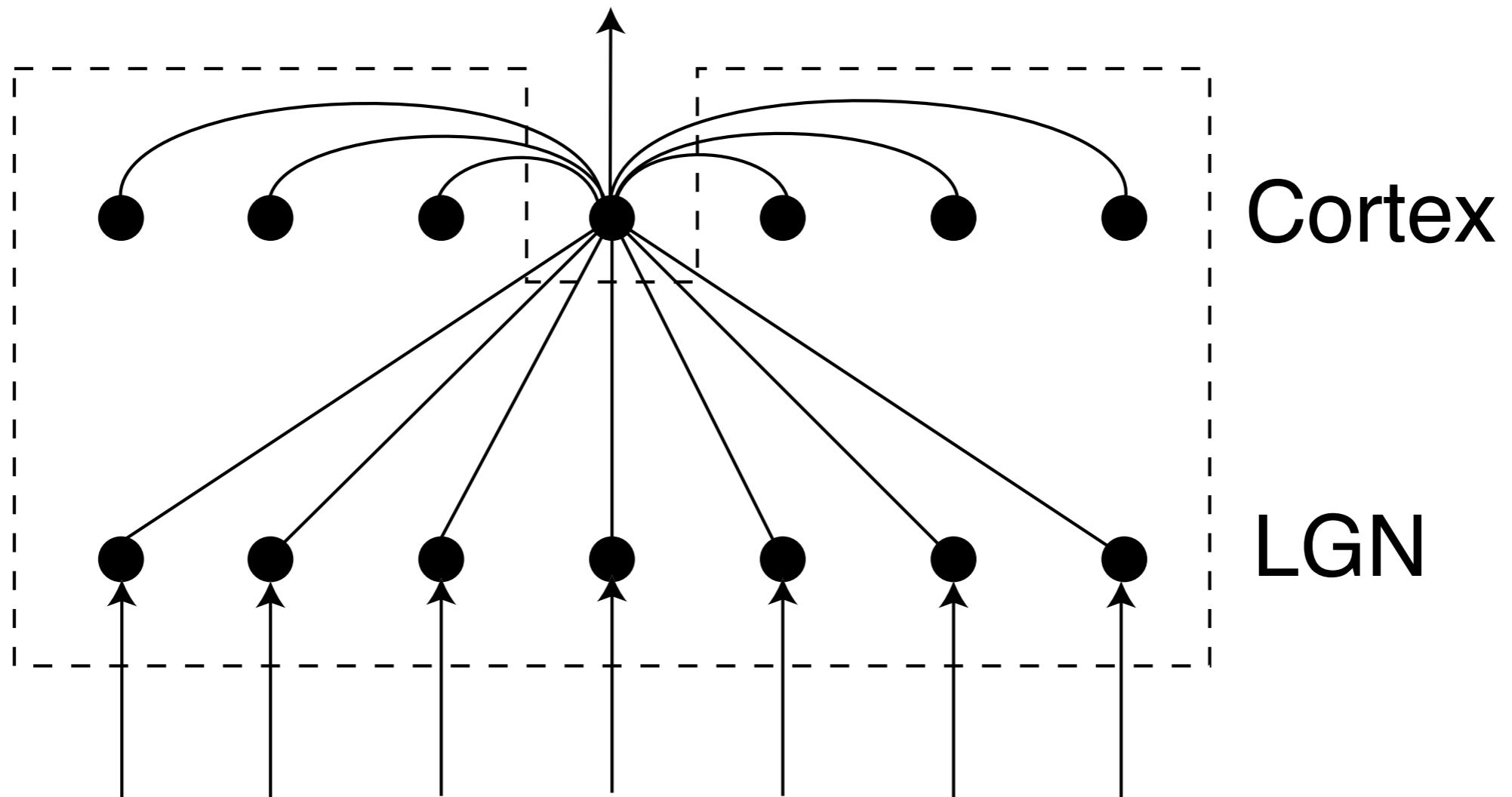




# Responses of neighboring cells are heterogeneous



# Single unit recording is blind to neuronal interactions

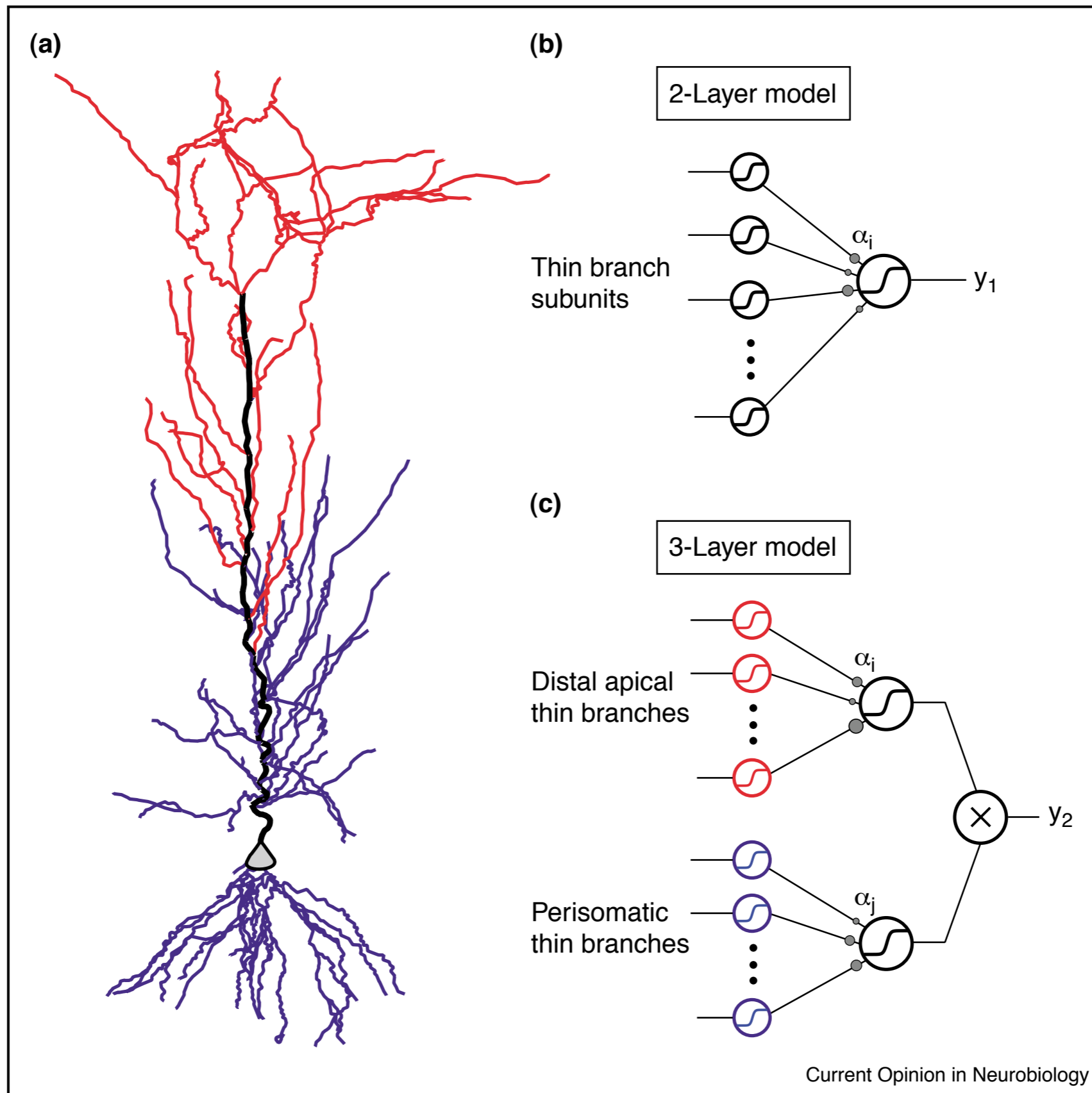


*...their (neurons') apparently erratic behavior was caused by our ignorance, not the neuron's incompetence. -- H.B. Barlow (1972)*



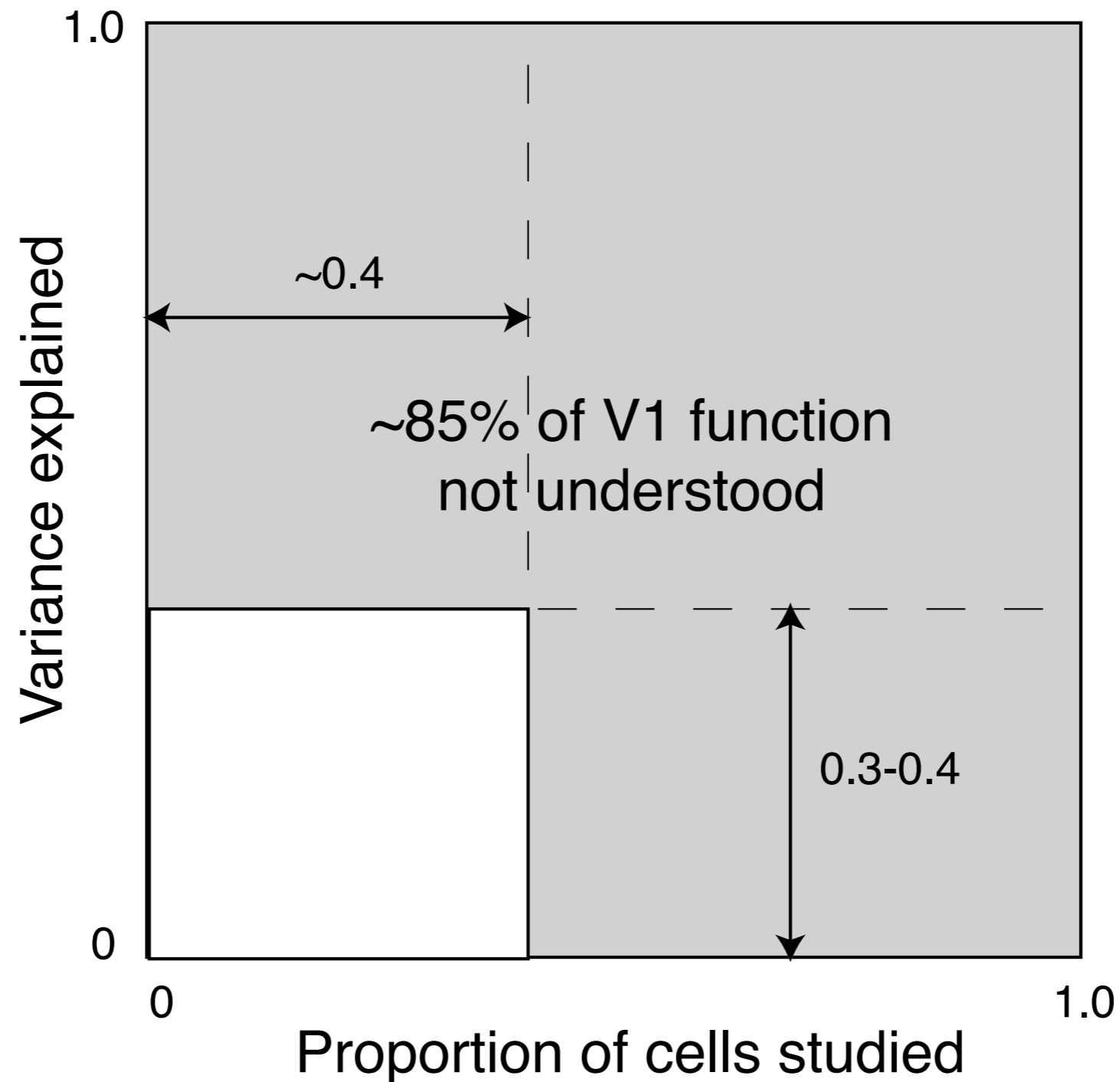
# Dendritic nonlinearities

(Hausser & Mel, 2003)

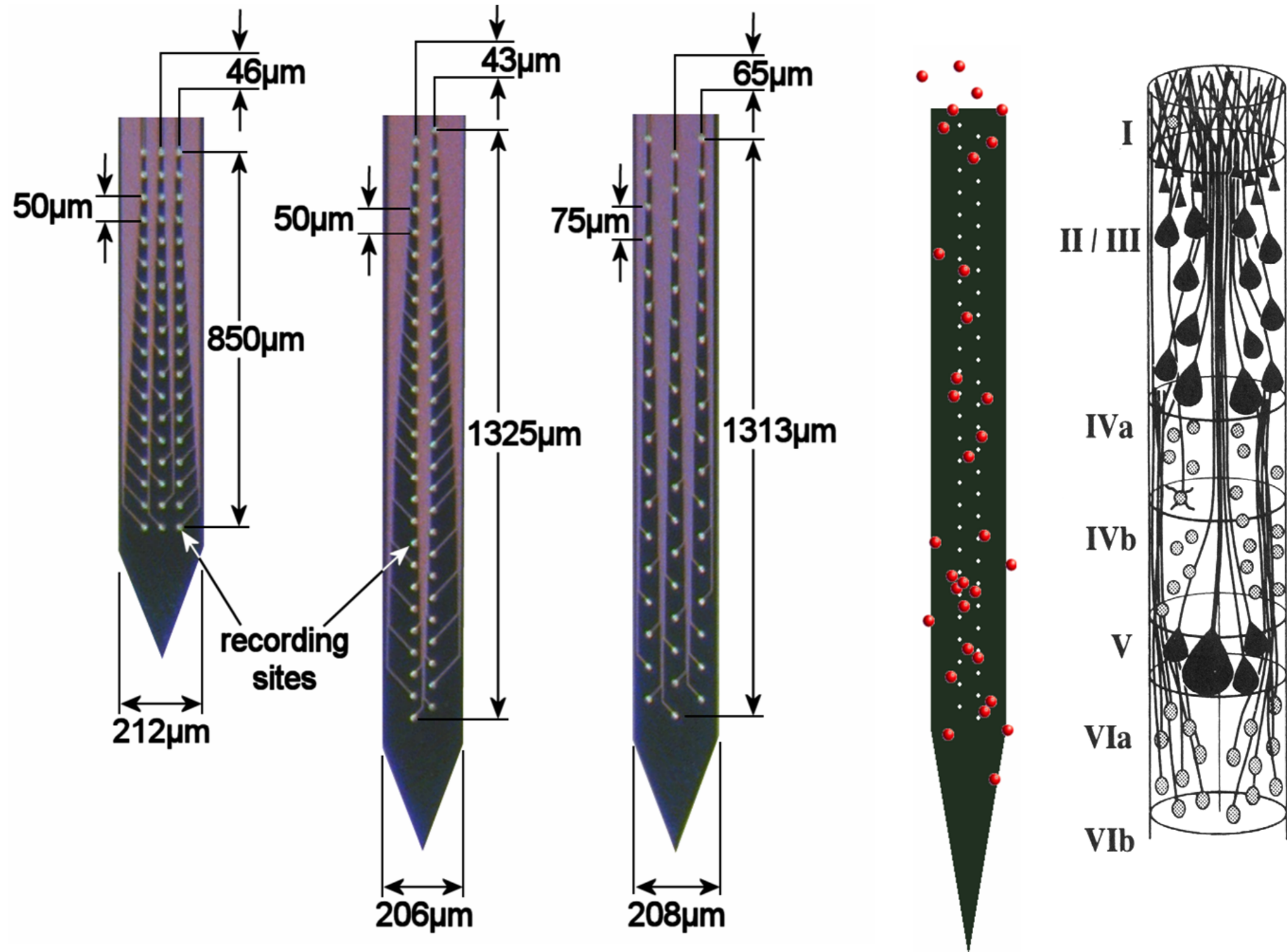


# What is the other 85% doing?

(Olshausen & Field, *Neural Computation*, 2005)

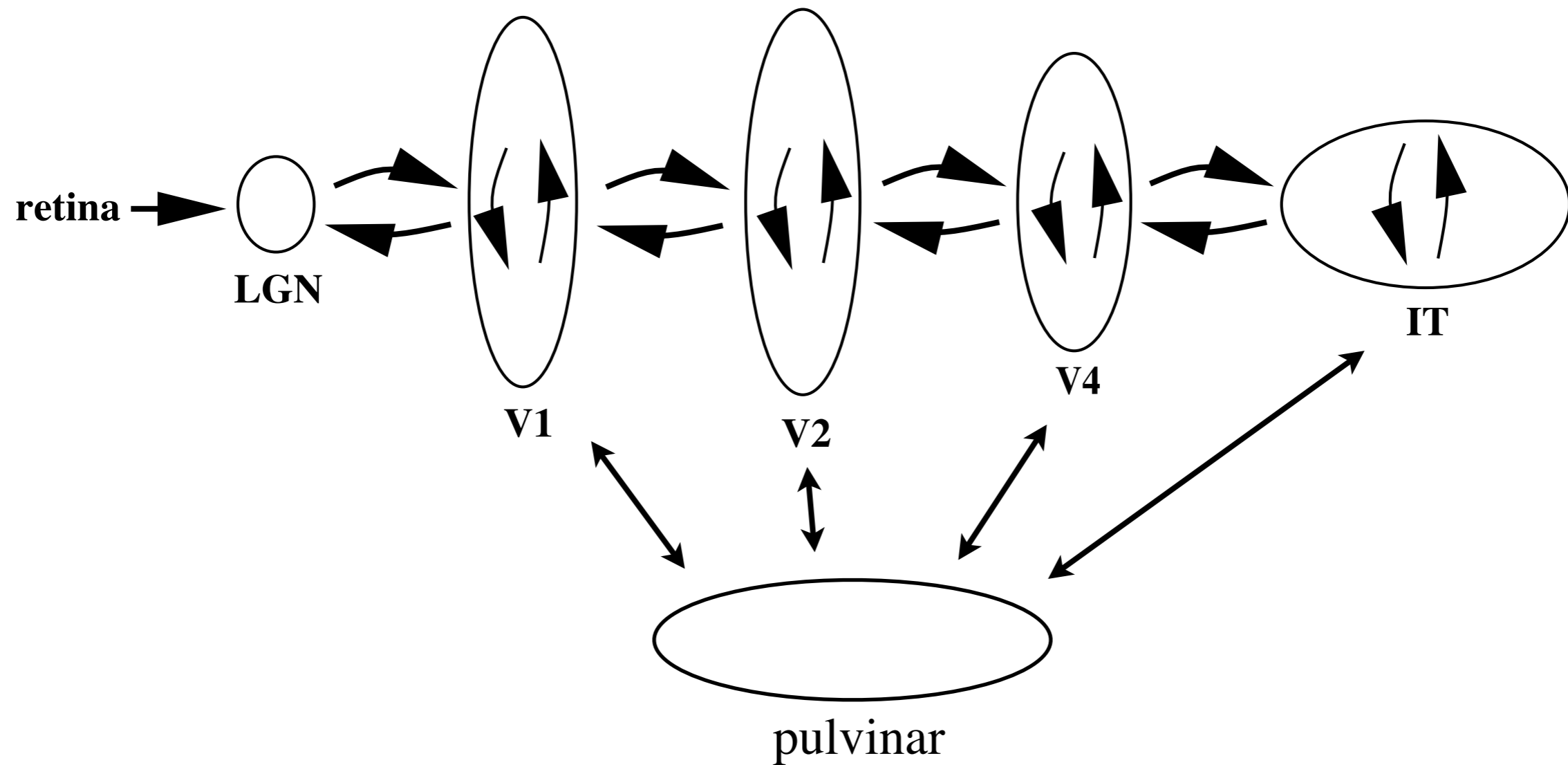


# Silicon polytrodes

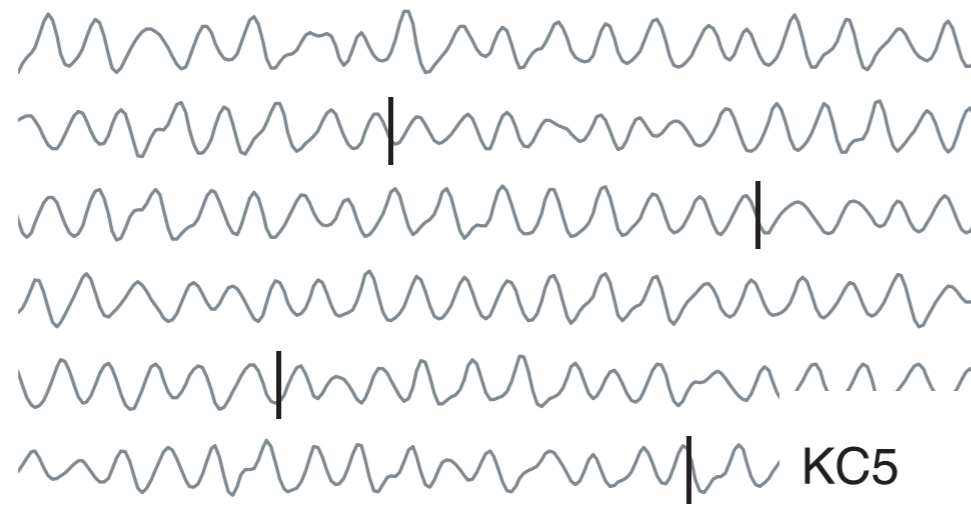




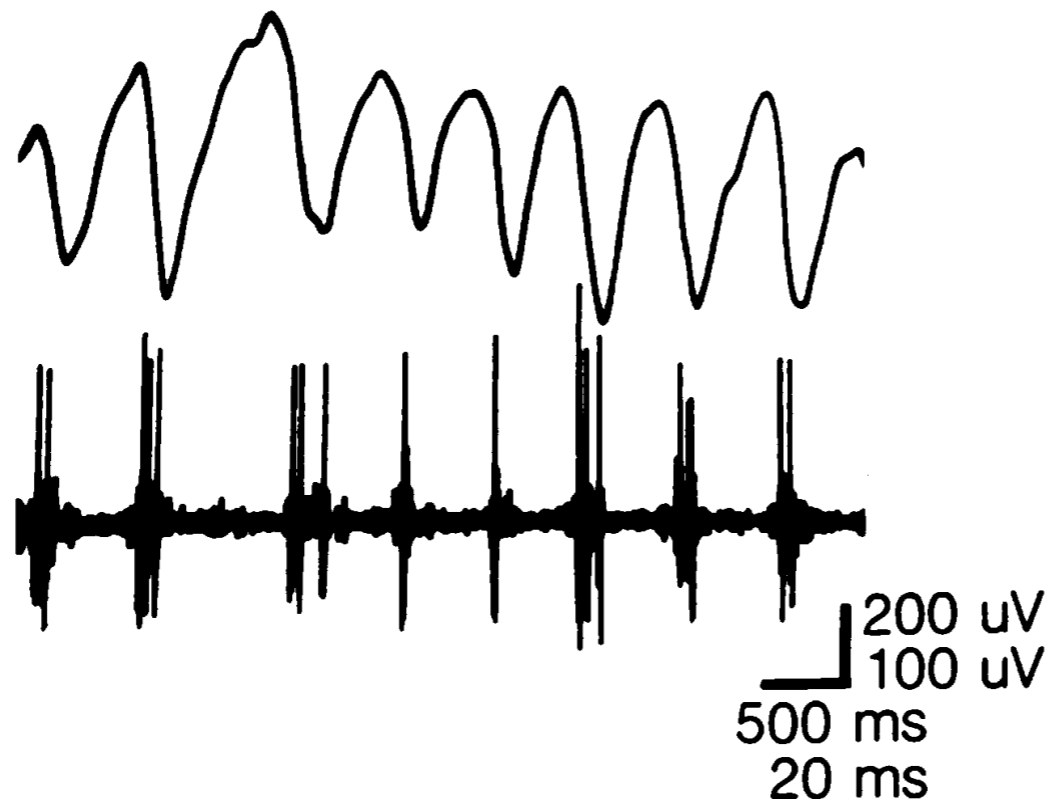
# What is the role of cortico-cortical and thalamo-cortical feedback?



# Neuronal oscillations are prevalent in sensory systems throughout the animal kingdom

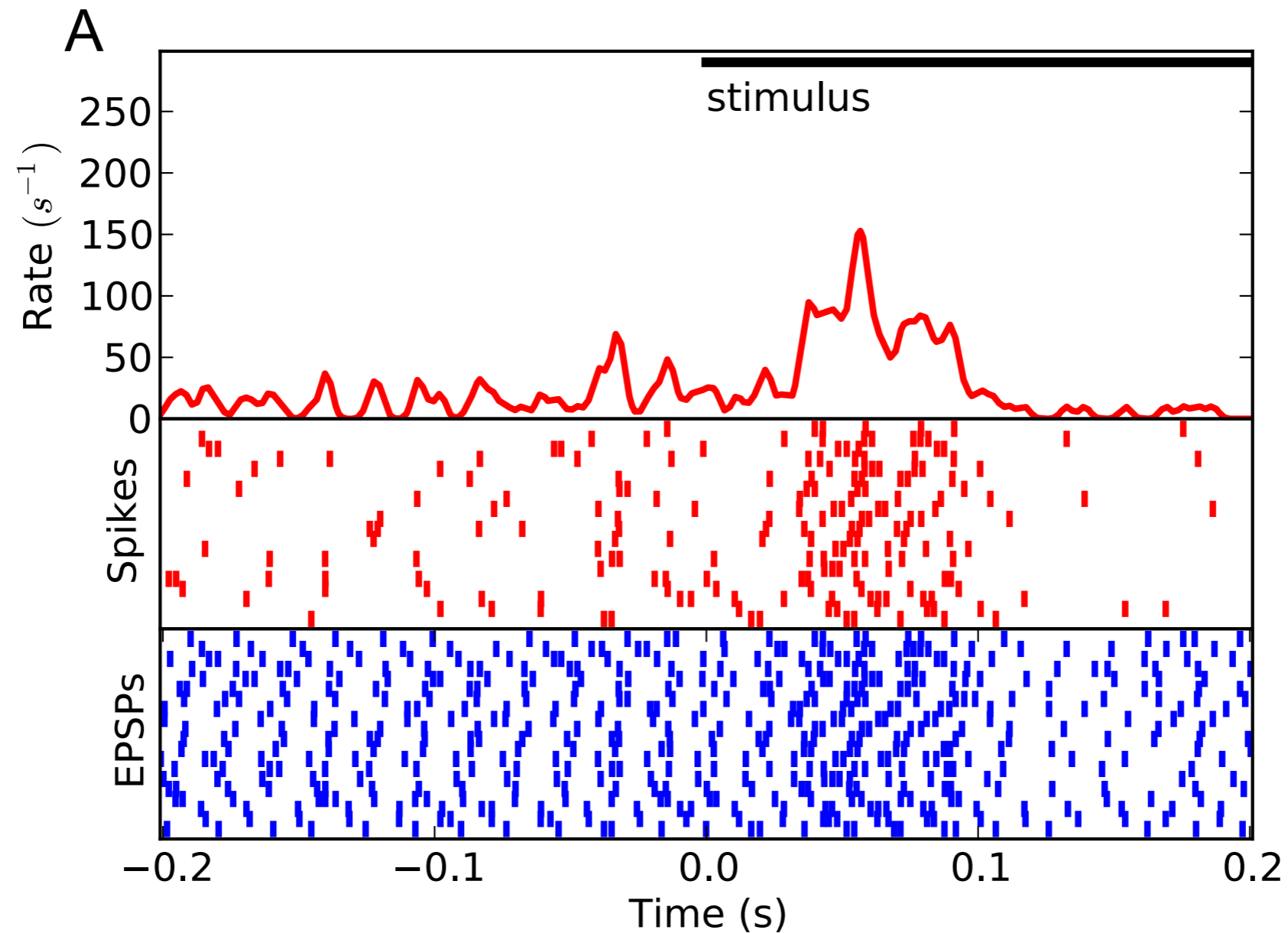


Locust olfactory system  
(Laurent lab)



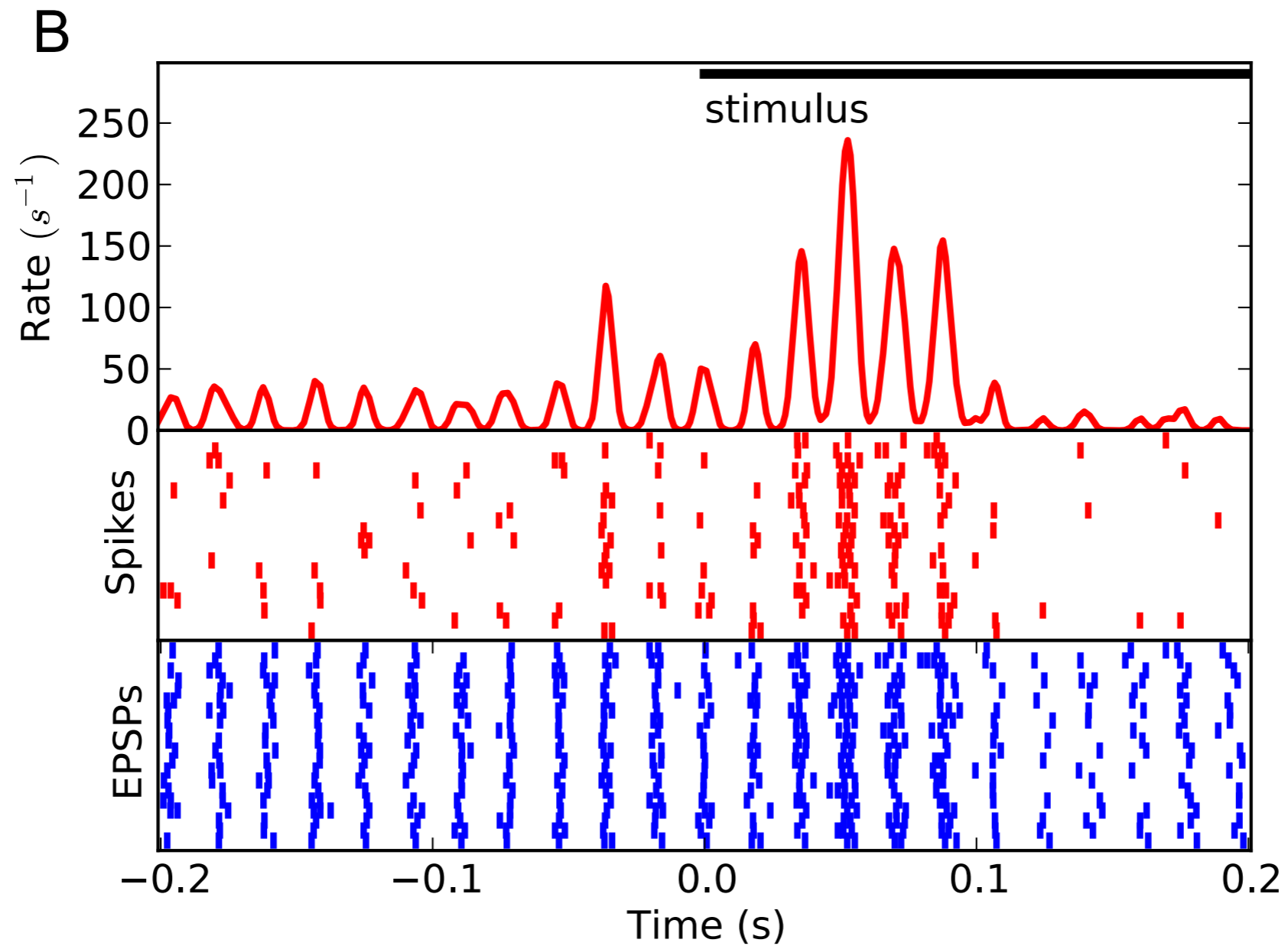
Cat VI  
(Gray & Singer)

# LGN neurons phase-lock to retinal oscillations (recordings from Hirsch lab, USC)



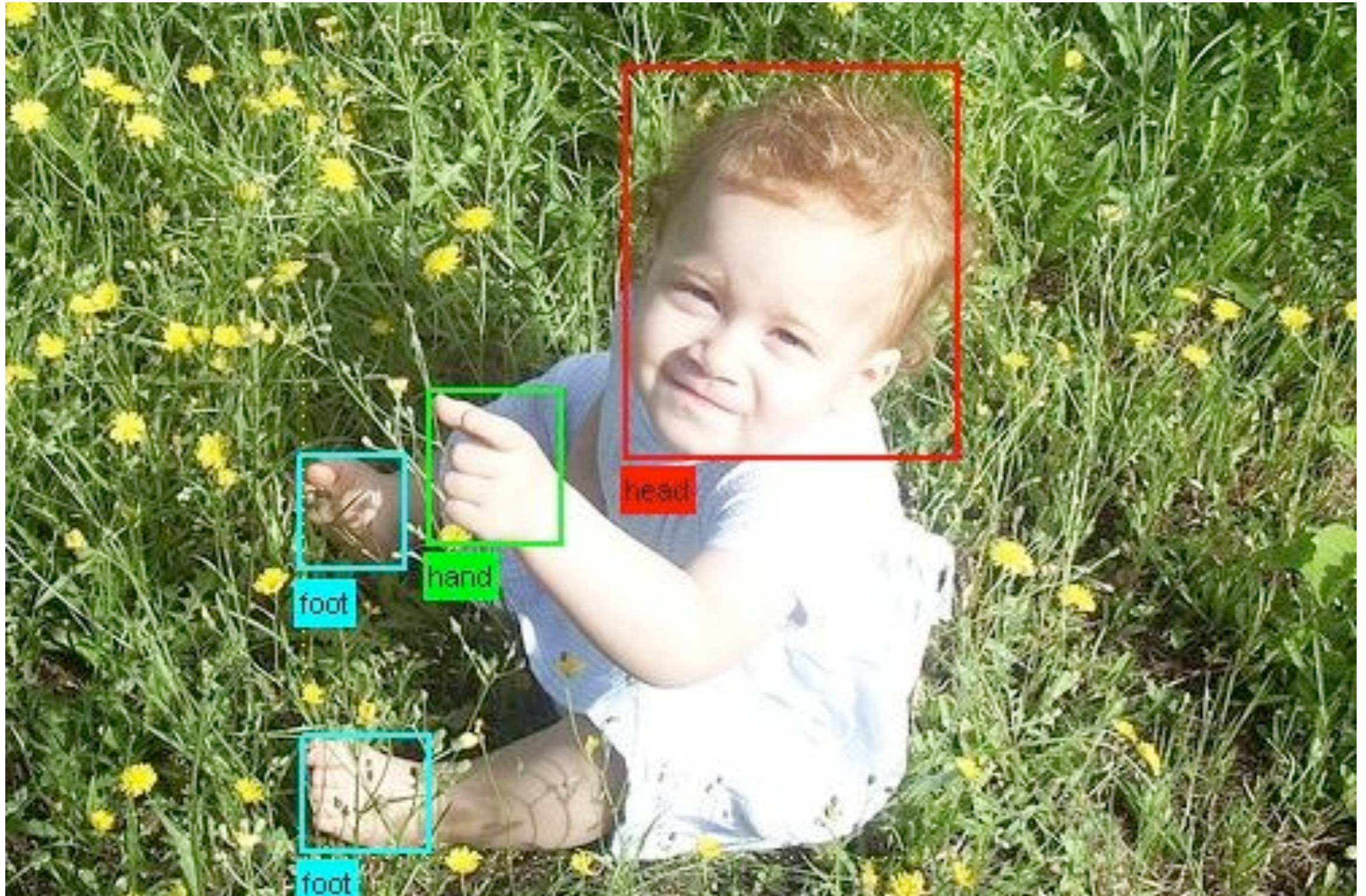


# Same activity corrected for phase of ongoing retinal oscillations





# Computer vision: is this the right task?





# The towel folding robot

(Maitin-Shepard & Abbeel, UC Berkeley)



[http://berkeley.edu/news/media/releases/2010/04/02\\_robot%20.shtml](http://berkeley.edu/news/media/releases/2010/04/02_robot%20.shtml)

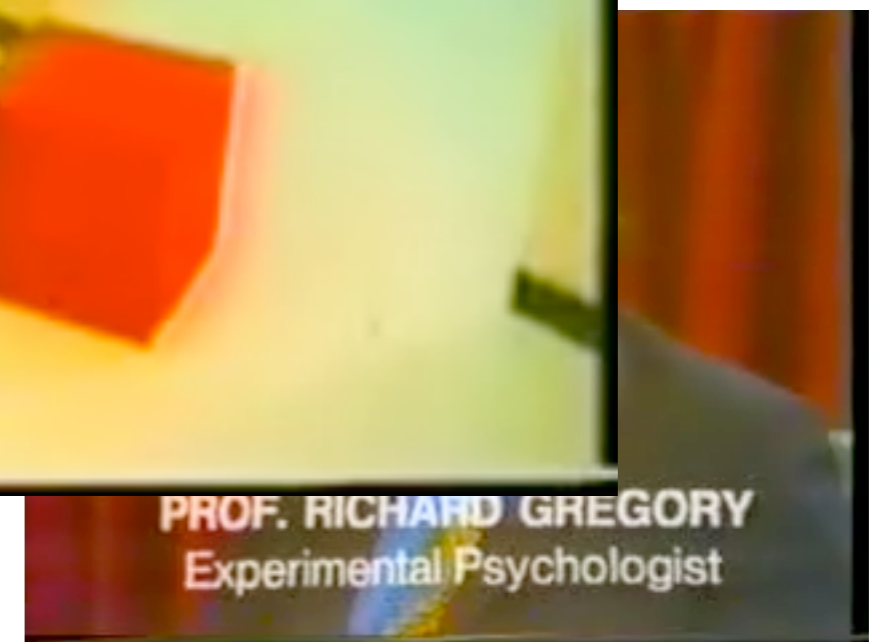
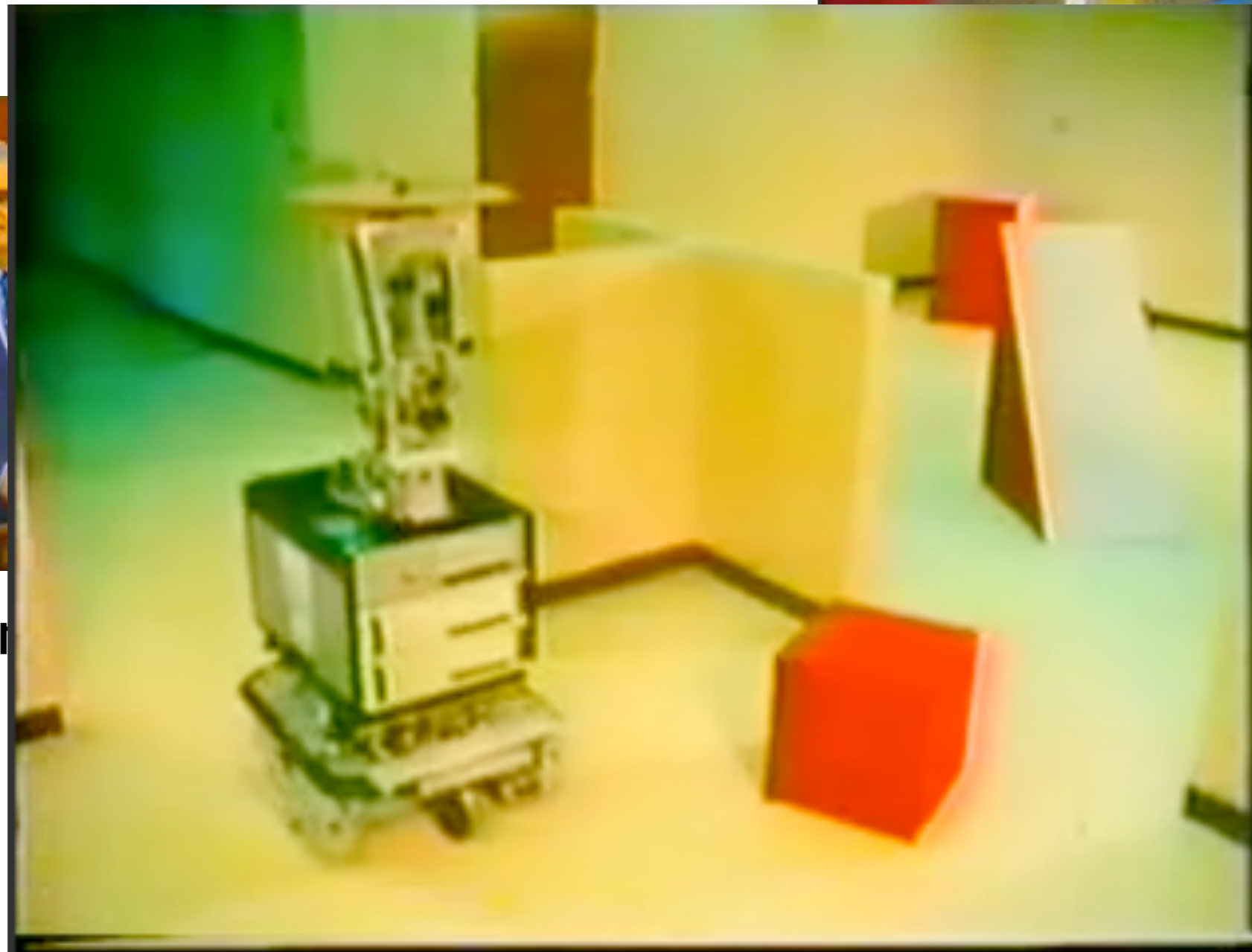


# The Lighthill debate (1973)

<http://www.aiai.ed.ac.uk/events/lighthill1973/>



Sir James Lighthill



**Questions we haven't  
yet asked**

Scientists by their nature are eager to test hypotheses, or to “tell a story” about how a given set of facts or findings fit together and explain perception.

But most of these hypotheses and stories are far too simple-minded, and ultimately they turn out to be wrong.

We may be better served by taking an exploratory approach.



# The frontiers

Surface representation

*Large-scale* neural dynamics

Perception-action loops

(See Noe & O'regan, "A sensorimotor account of vision and visual consciousness," BBS, 2001)

# Santa Fe Institute workshop on action and perception

September 14-16, 2010

**Organizers:** Murray Sherman, Ray Guillery, Nihat Ay, Bruno Olshausen, Fritz Sommer

## **Speakers:**

Ehud Ahissar

Andy Clark

Ralf Der

Carol L Colby

Keyan Ghazi-Zahedi

Jeff Hawkins

Yasuo Kuniyoshi

Chris Moore

J. Kevin O'Regan

Rolf Pfeifer

Daniel Polani

Marc Sommer

Naftali Tishby

To apply, email CV and statement to [msherman@bsd.uchicago.edu](mailto:msherman@bsd.uchicago.edu)