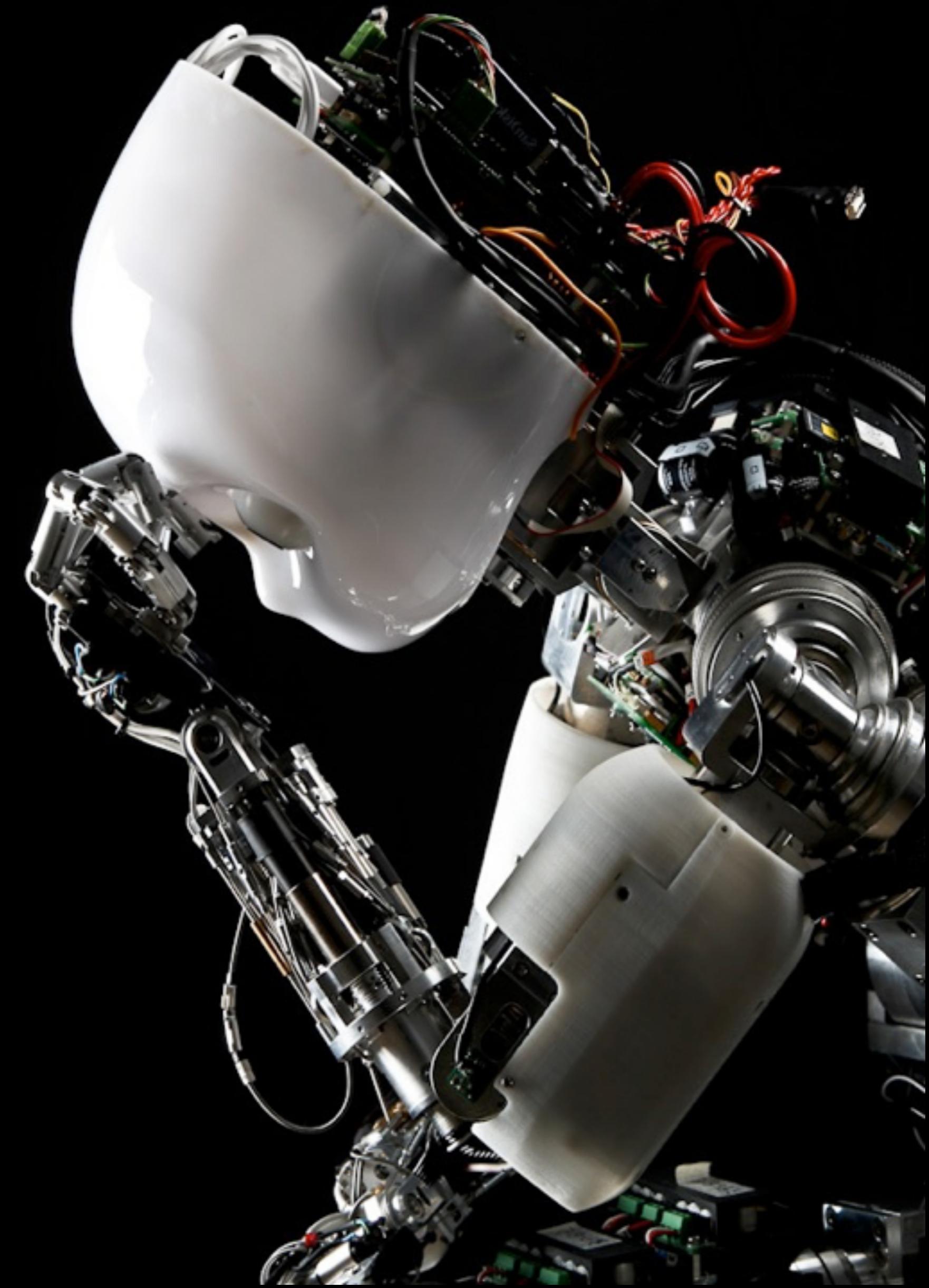


Machines and Intelligence  
COM1005



# THE PSYCHOLOGY OF AI

tony prescott



the psychology of



THE  
PSYCHOLOGY  
OF **EVERYTHING**



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- What is intelligence?
- Brains and computers
- The building blocks of intelligence
- Learning in neural networks
- Towards Artificial General Intelligence (AI)
- Living with Artificial Intelligence

# THIS WEEK: HOW VISION WORKS

These lectures explore the nature of human visual perception, to understand the challenges that need to be addressed in creating artificial visual systems



Image from Pxfuel

1. How patterns of light are detected by the eye and processed in the brain
2. Principles that make it possible to sense the world through vision
3. Seeing as a form of “unconscious inference”

# HOW VISION WORKS

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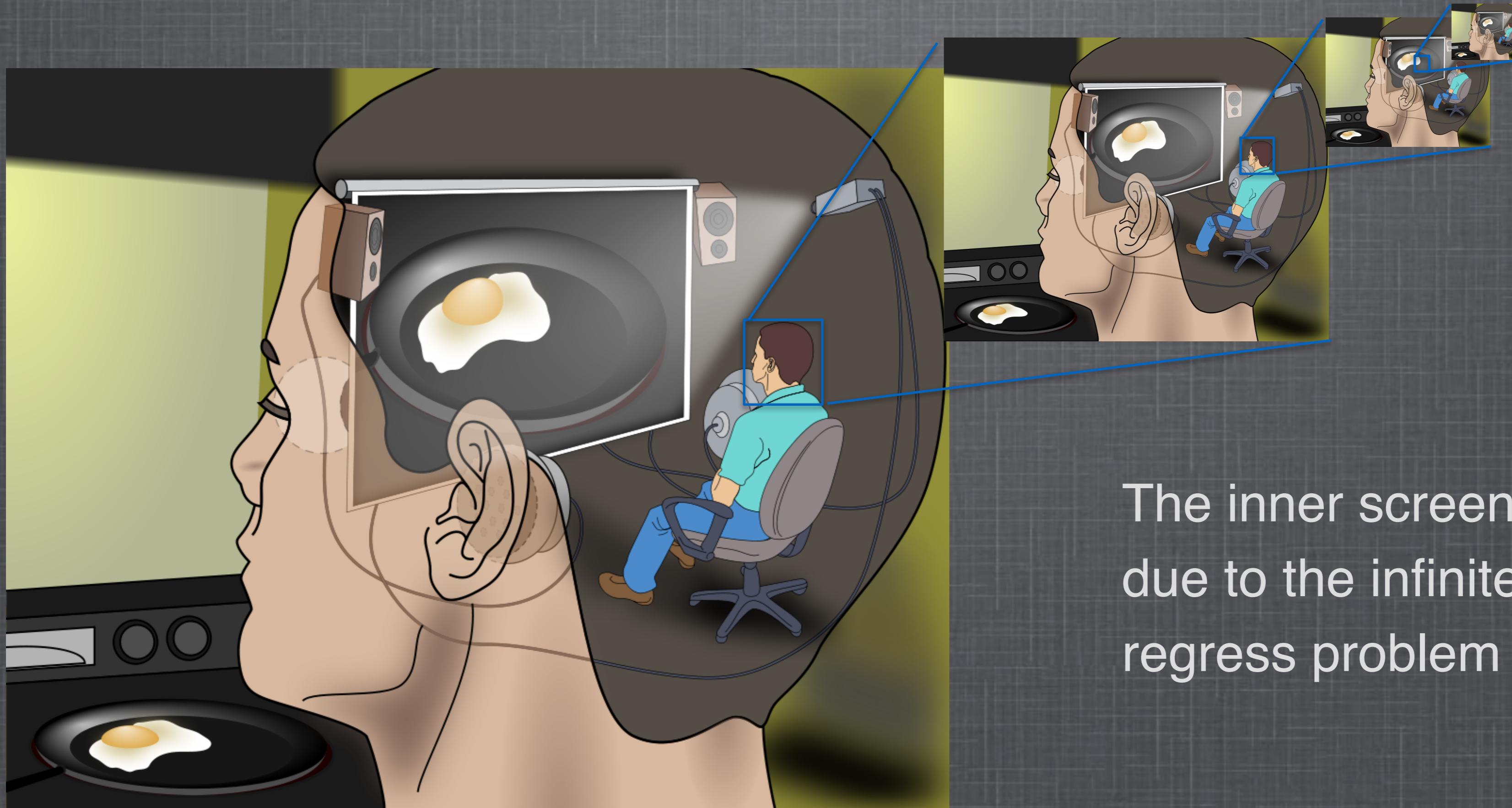
Image from Pxfuel



Image from Shadow Robotics (CC-BY)

- 1. How patterns of light are detected by the eye and processed in the brain**
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# THE “INNER SCREEN” THEORY OF SEEING



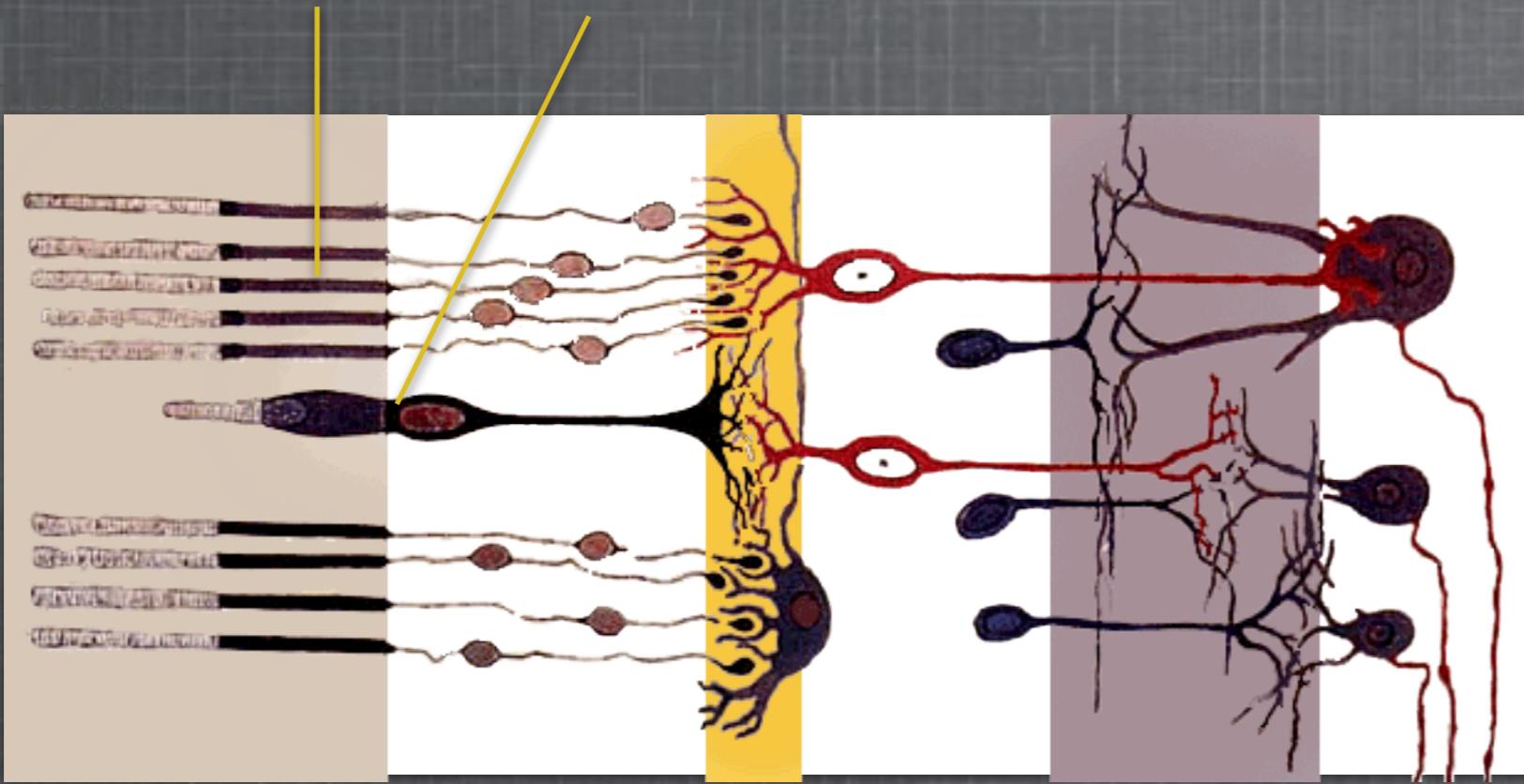
Jennifer Garcia, Wikimedia, CC-BY

The inner screen ‘theory’ proposes that the brain represents the brightness of points in the scene like a being in a movie theatre (Daniel Dennett called this the “Cartesian Theatre”). Here it is imagined upright to match our perceptions of the world.

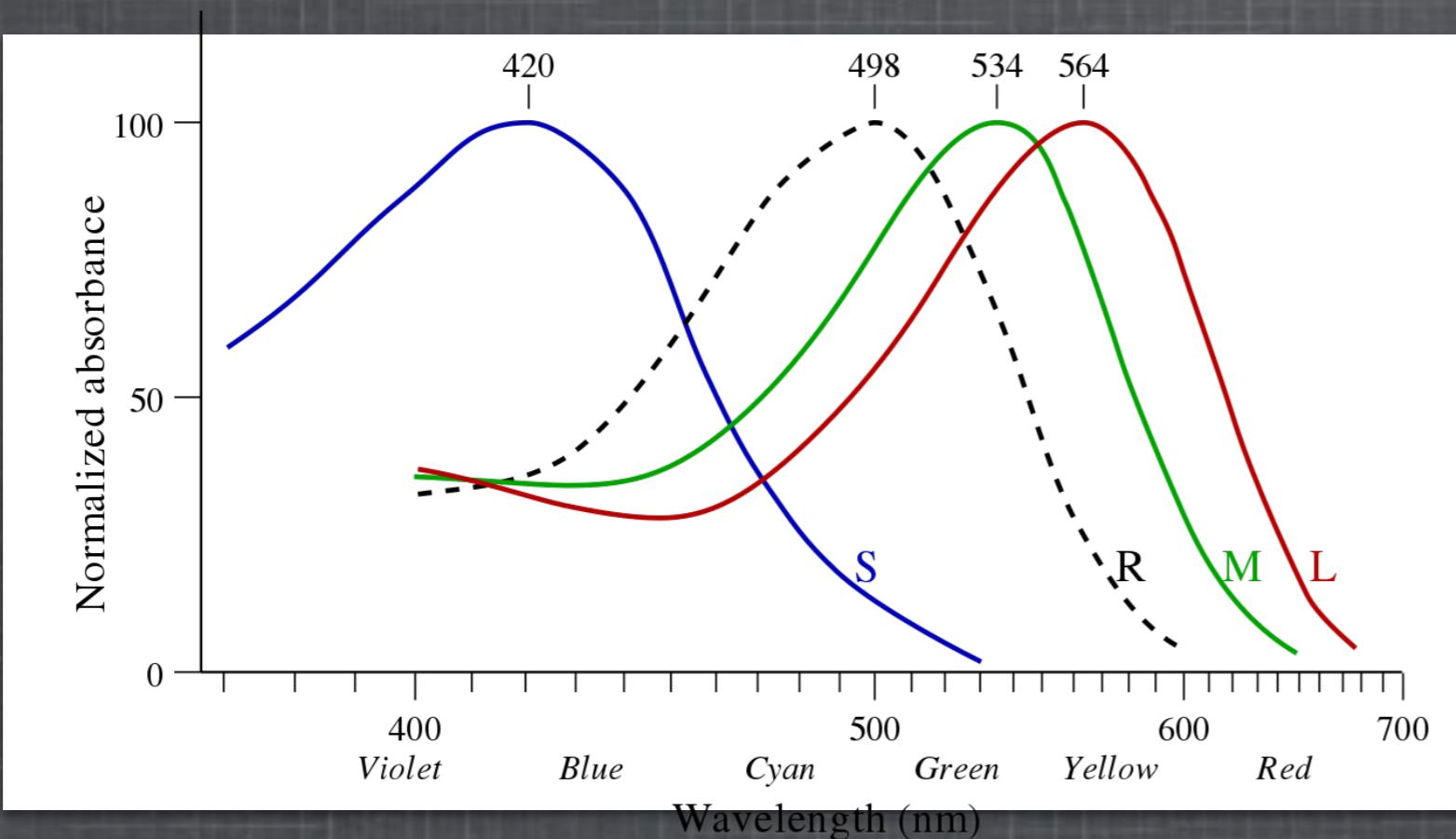
The inner screen fails  
due to the infinite  
regress problem

# MAKING LIGHT INTO ‘SPIKES’

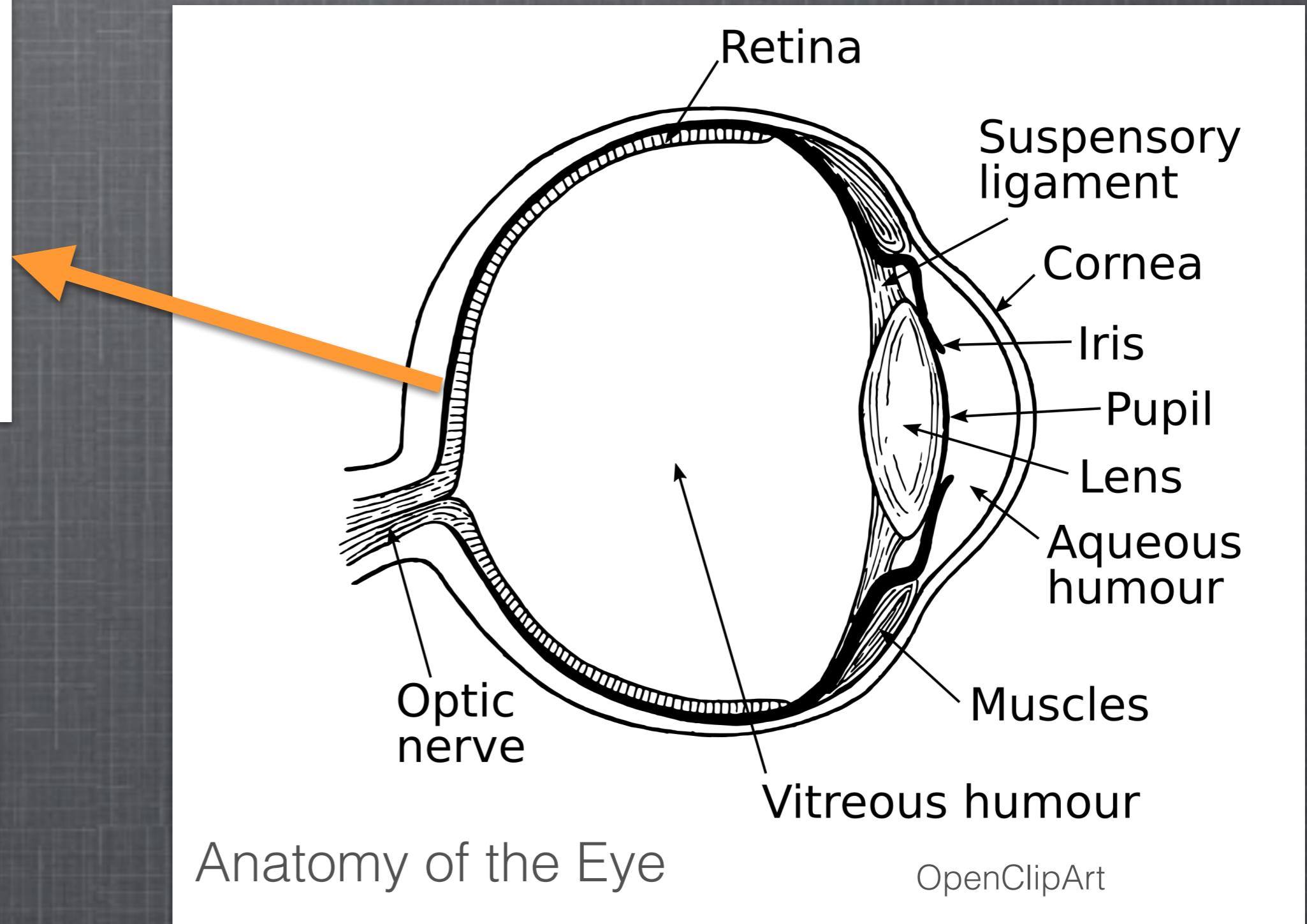
Rod cells      Cone cell



Organization of the retina (from Cajal, 1911)

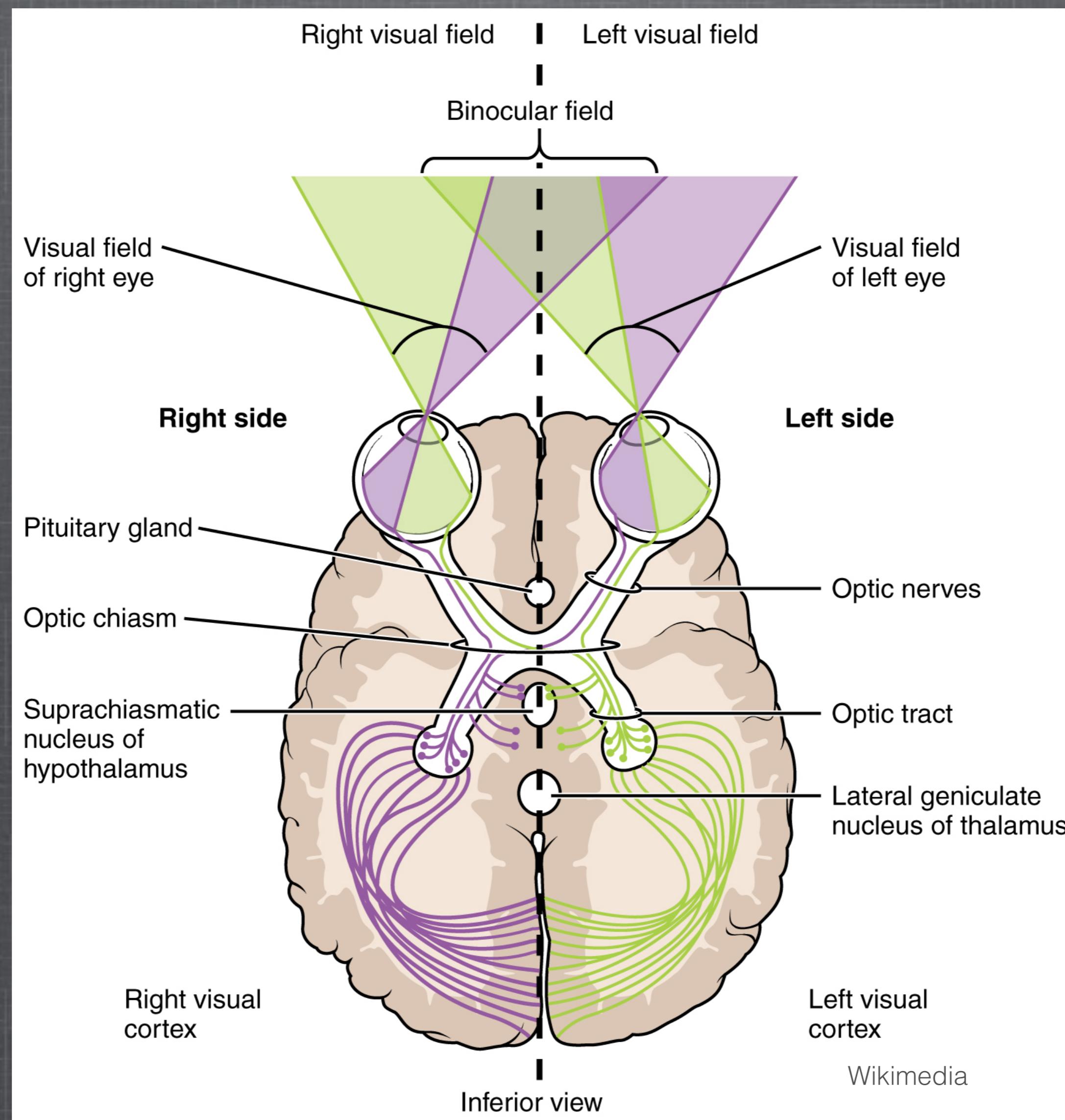


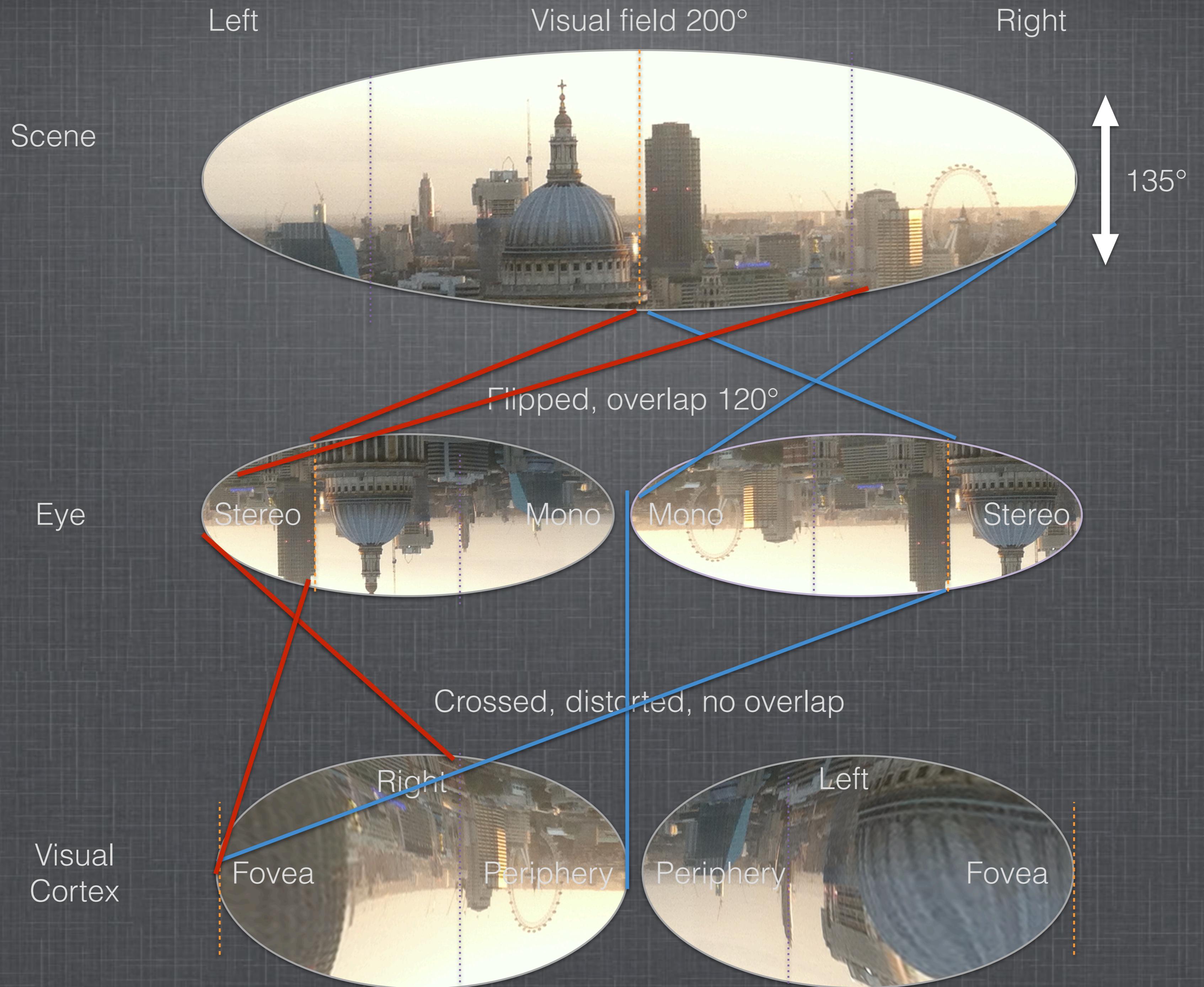
Wavelength responses



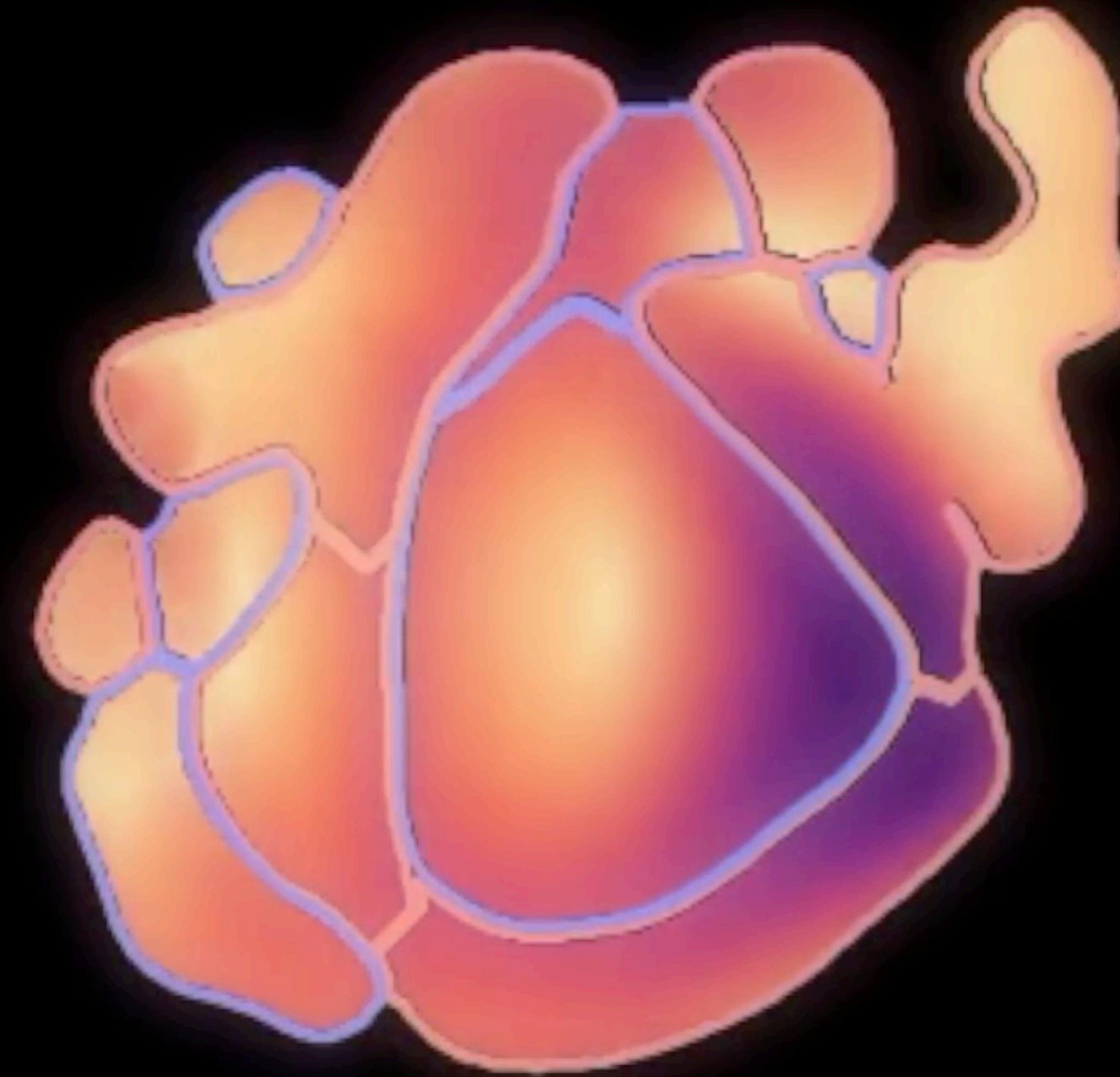
The human retina is an extension of the brain, it contains about 120 million rod cells and about 6 million cone cells

# THE HUMAN VISUAL SYSTEM AS TWO HEMIFIELDS





# THERE ARE MANY AREAS IN THE BRAIN THAT ARE ORGANISED AS RETINOTOPIC MAPS

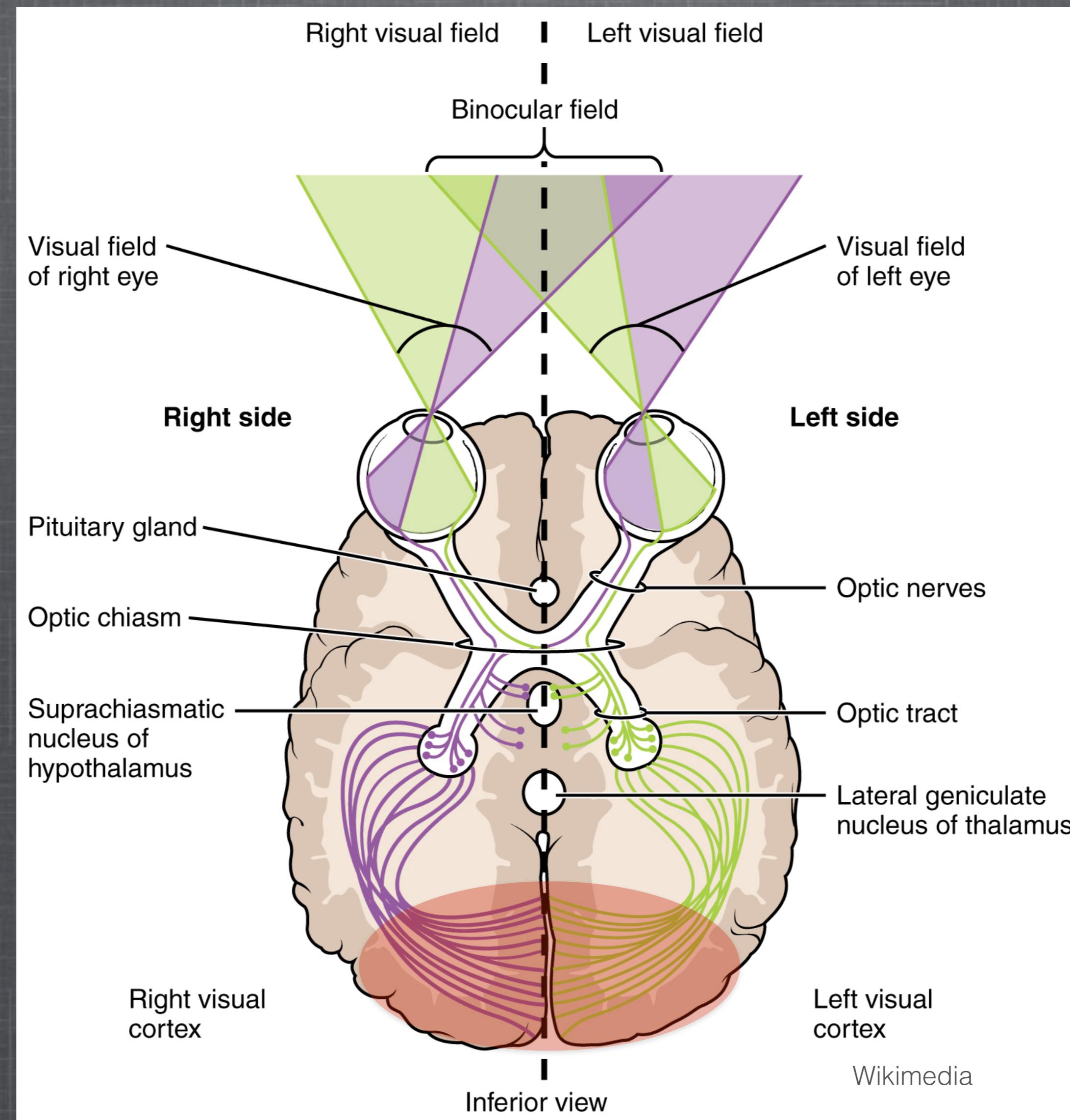


This is a map of the left hemisphere only  
Mouse brain simulation from Allen Brain Institute

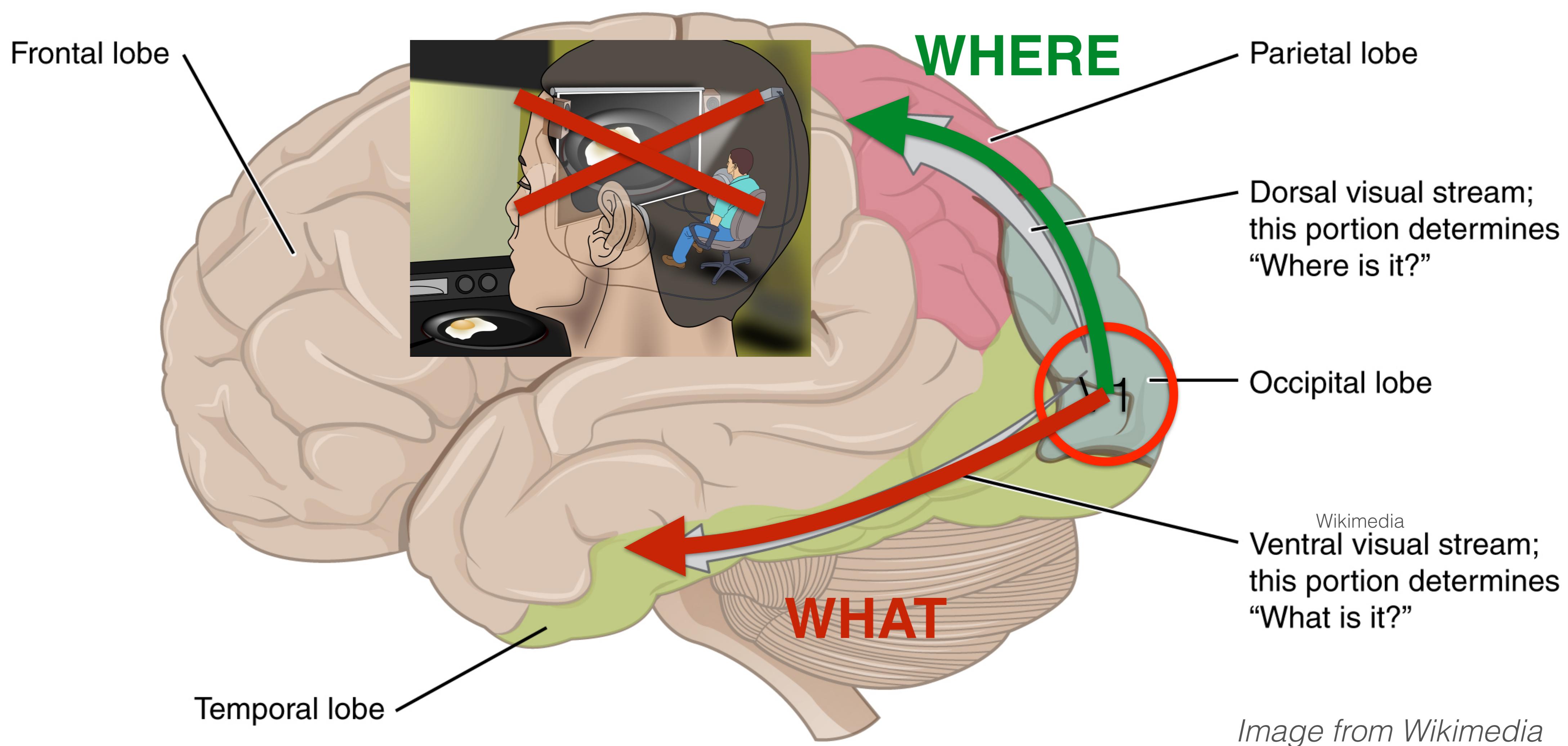
Zhuang et al. eLife 2017;6:e1837

Full video available on Youtube

# CORTICAL PROCESSING OF VISION STARTS FROM THE BACK

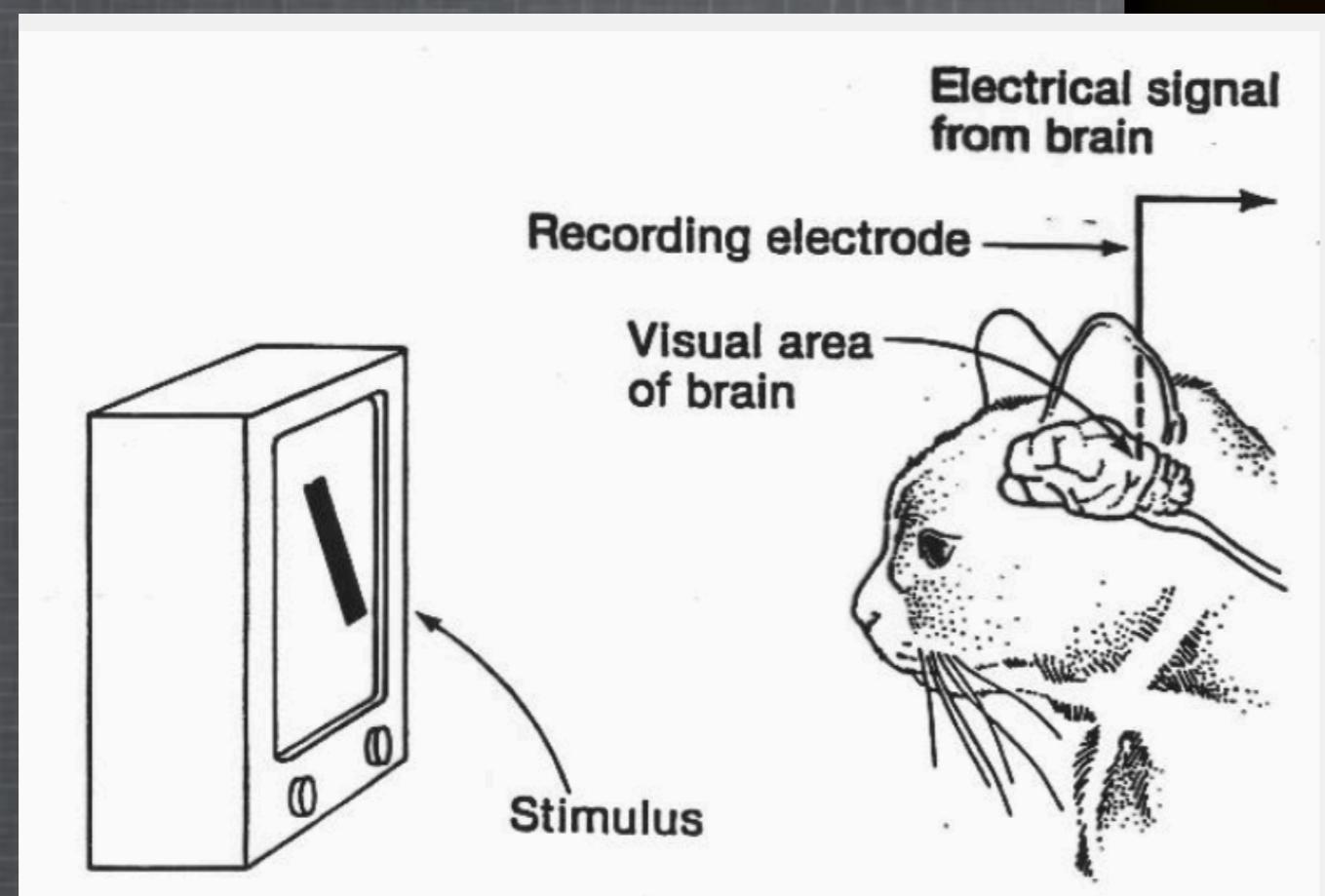


# VISION PROCESSING IN THE BRAIN FOLLOWS MULTIPLE PATHWAYS



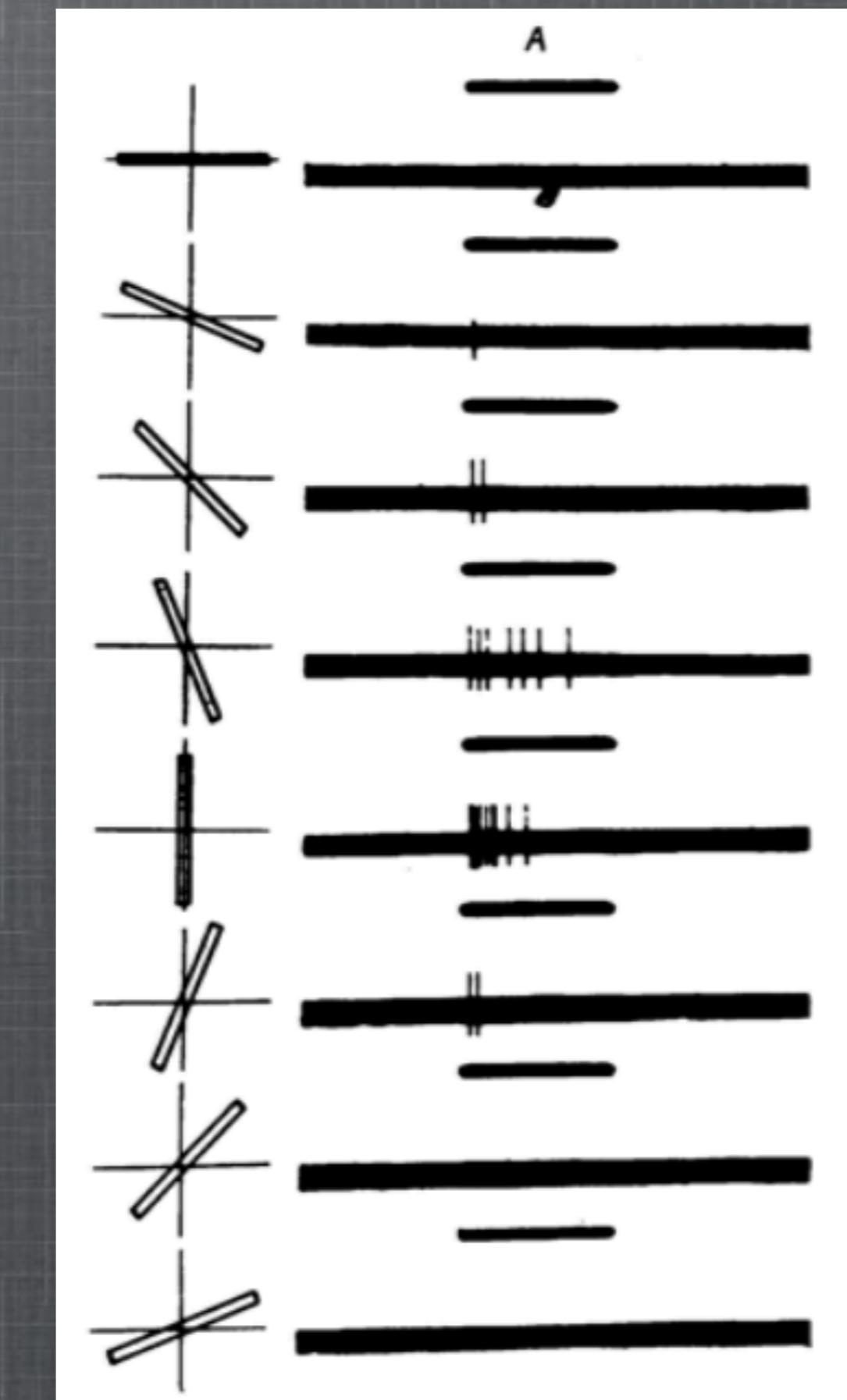
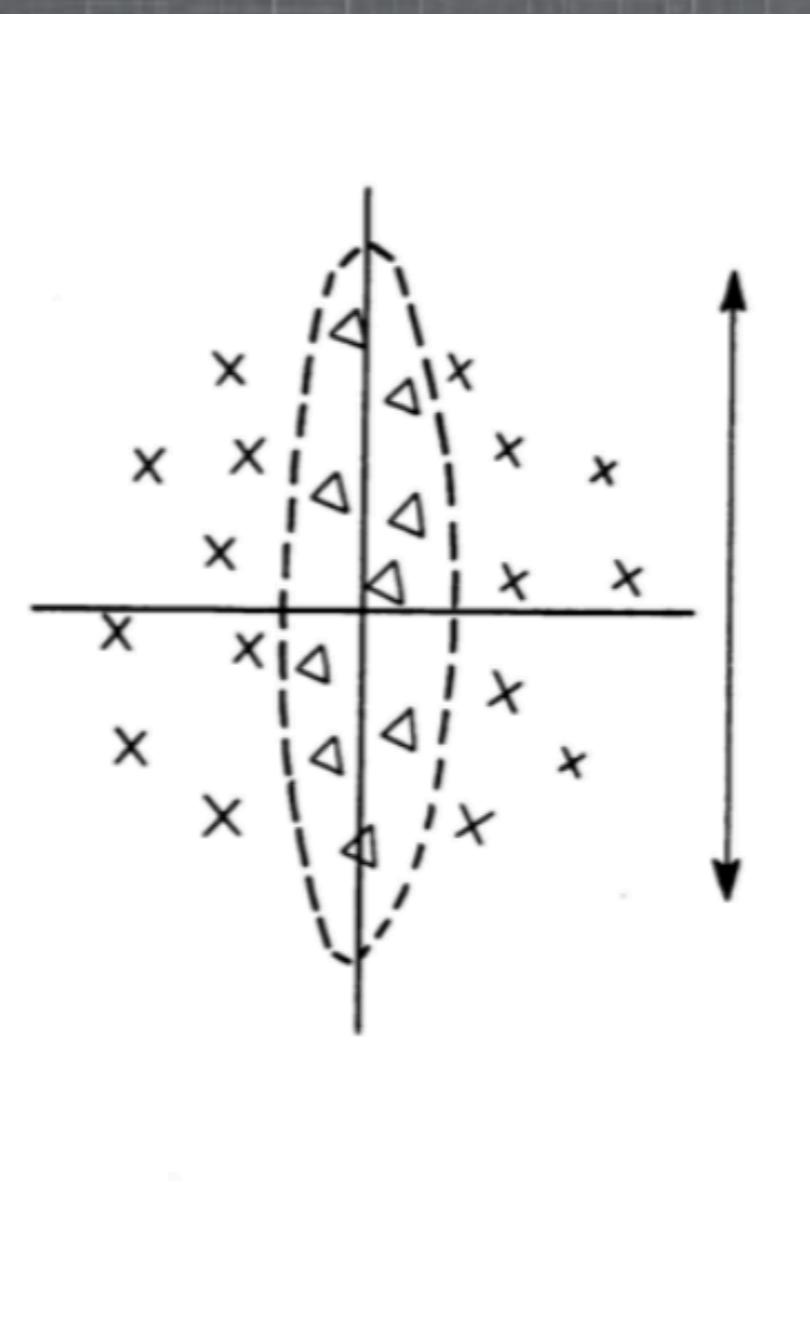
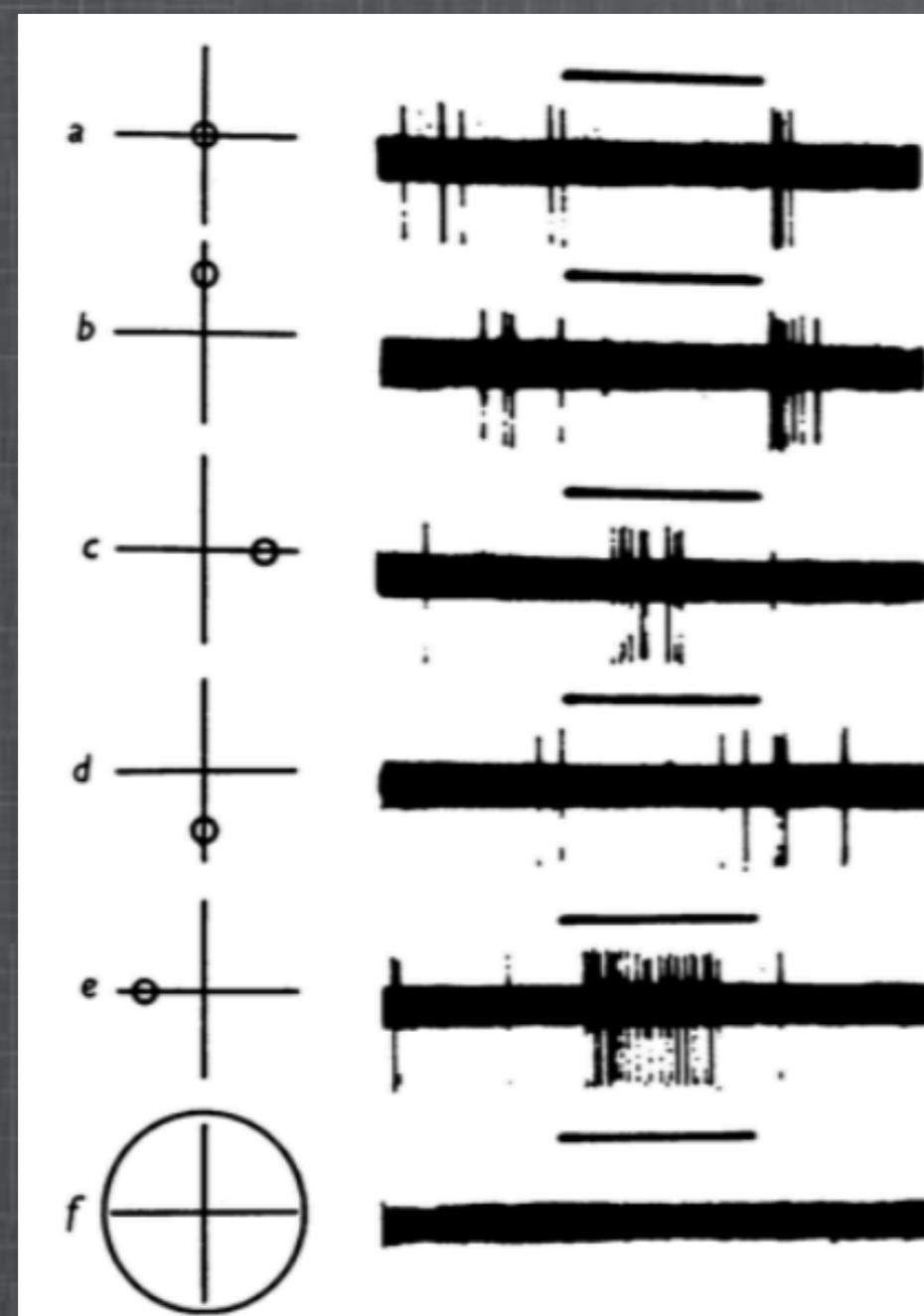
There is no single location where everything comes together...

# EDGE DETECTOR CELLS IN VISUAL CORTEX – HUBEL & WIESEL 1959

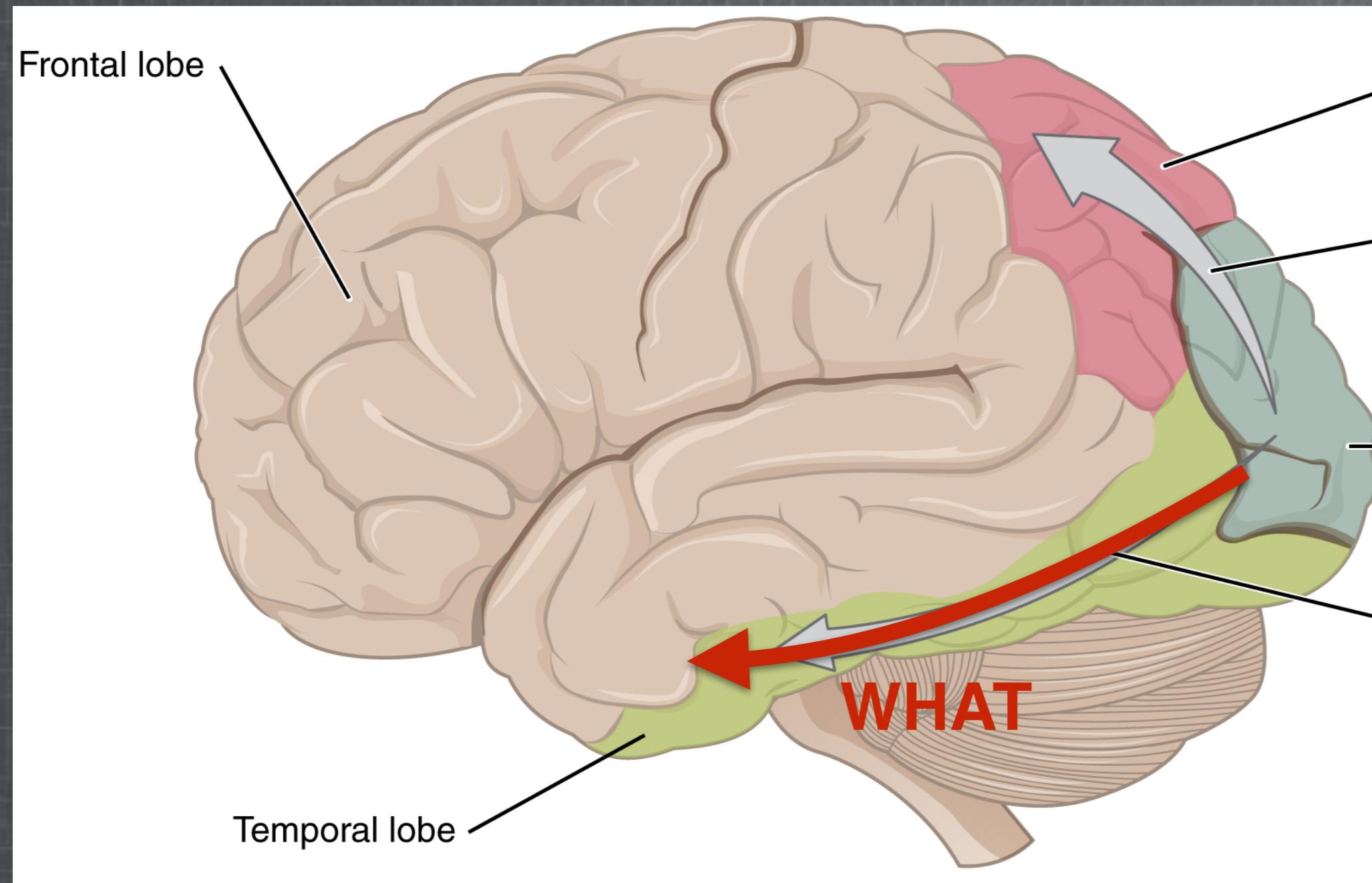


# AT THE BASE OF THE VISUAL PATHWAY – SEEING EDGES

Hubel and Wiesel found that single V1 cells responded preferentially to moving lines at preferred orientations

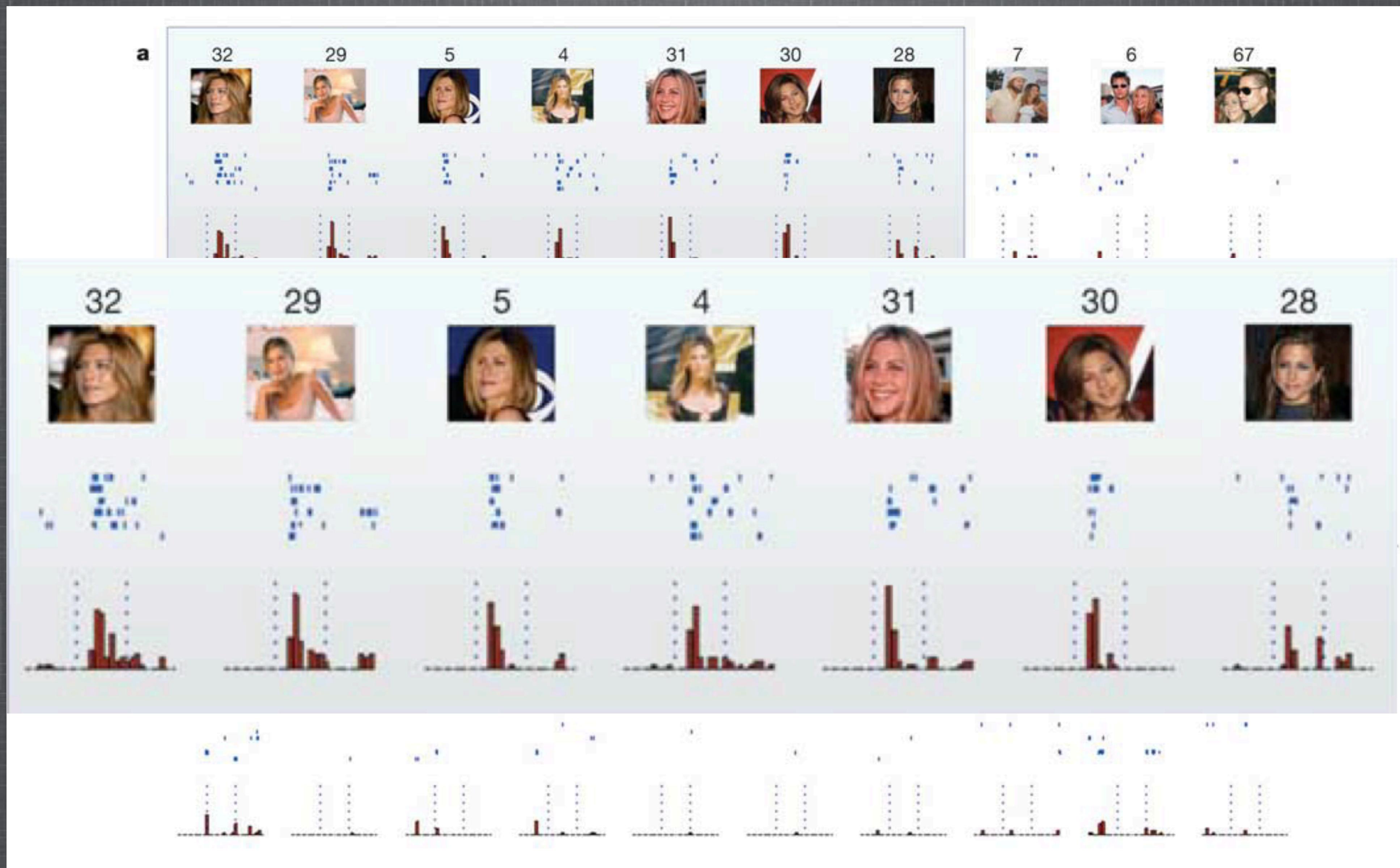


# AT THE UPPER END OF THE WHAT PATHWAY—HIGH-LEVEL CONCEPTS



Studies suggest that individual neurons in the temporal lobe respond to stimulus properties that correspond to high-level concepts such as people, place, objects...

# A NEURON THAT PREFERENTIALLY RESPONDS TO PICTURES OF JENNIFER ANISTON



# DEEP LEARNING IS REVOLUTIONISING COMPUTER VISION

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The New York Times

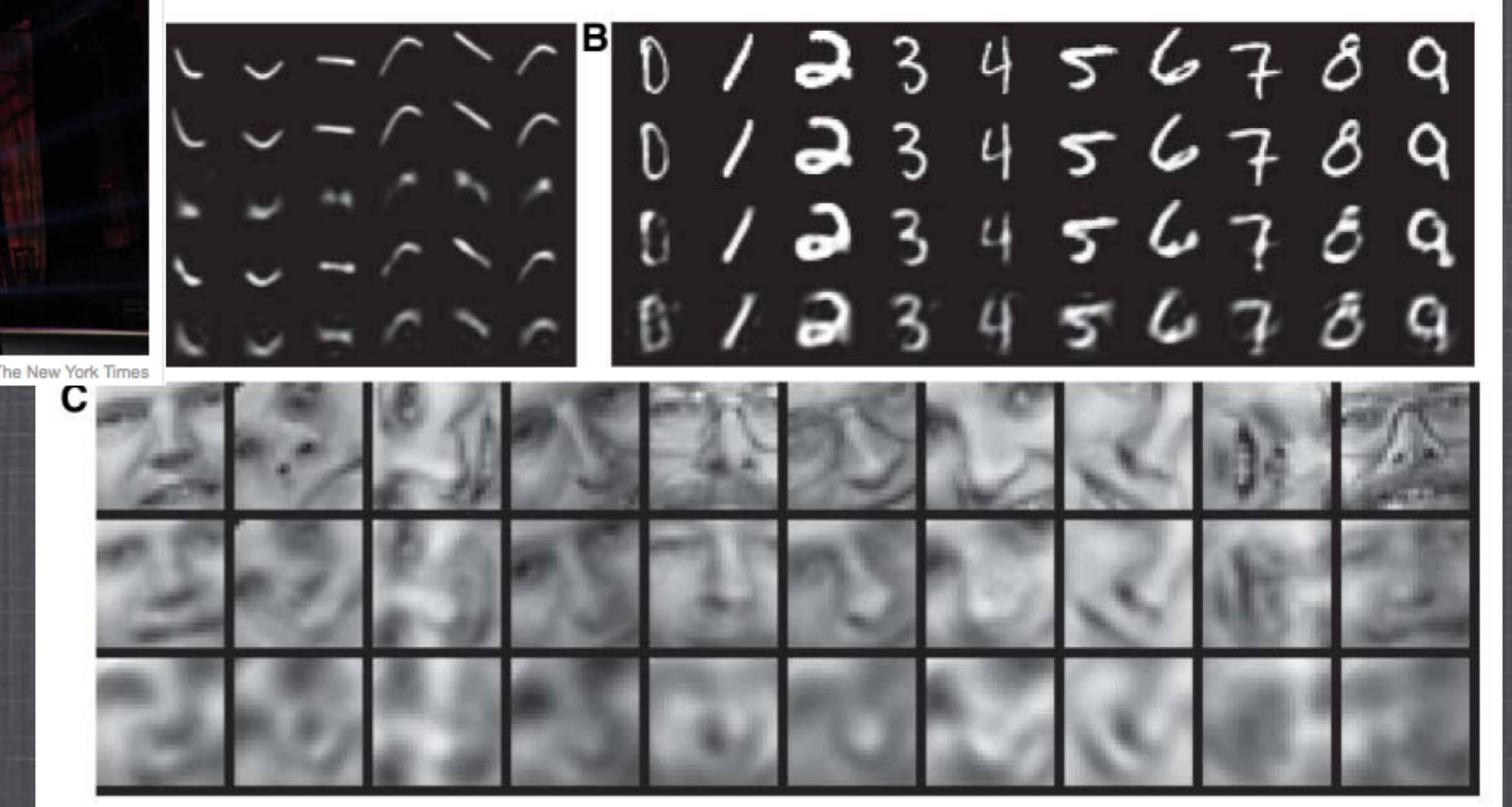
Science

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## Scientists See Promise in Deep-Learning Programs

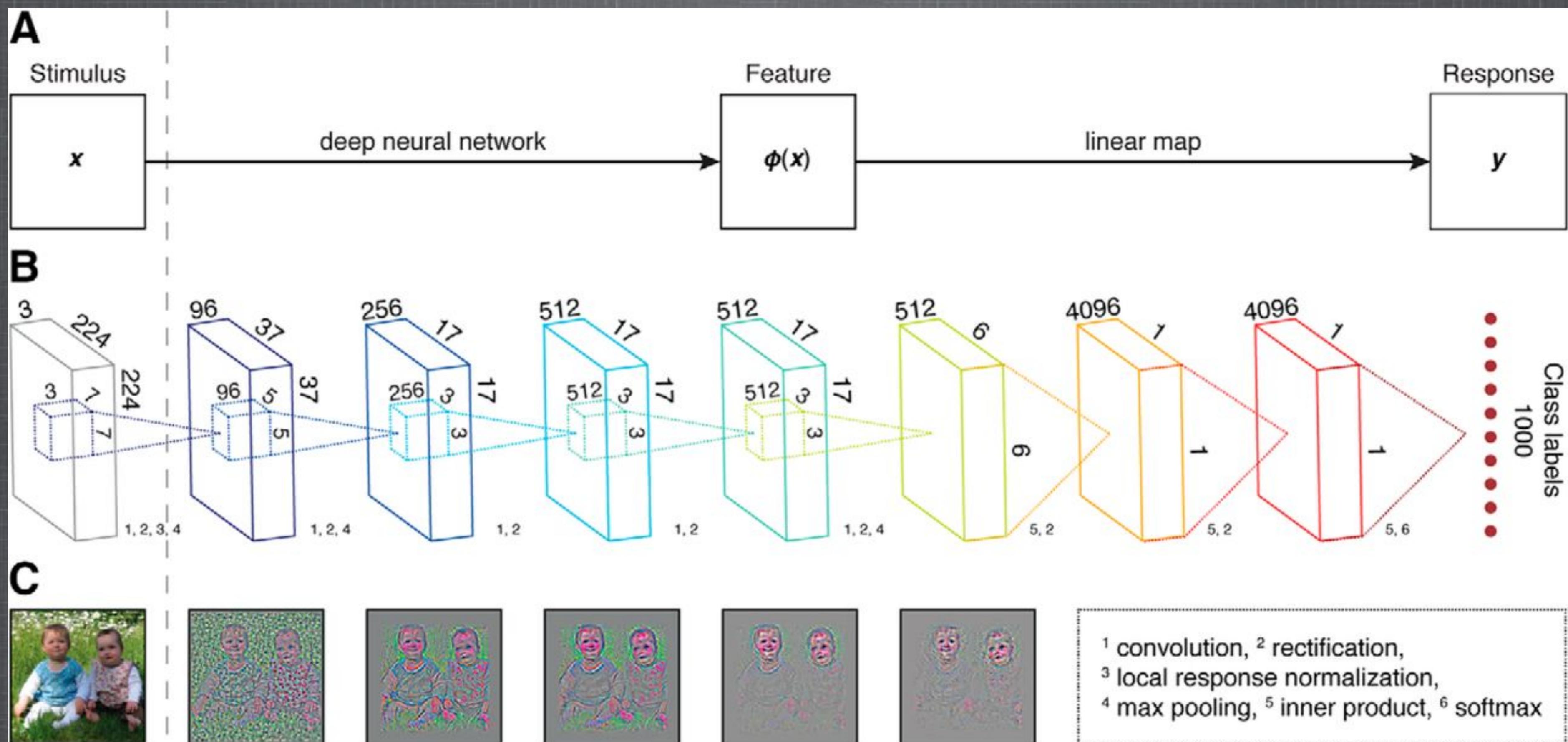
Hao Zhang/The New York Times

Deep neural networks are inspired by learning in human cortex. Their defining feature is that they have many layers of adaptable weights.

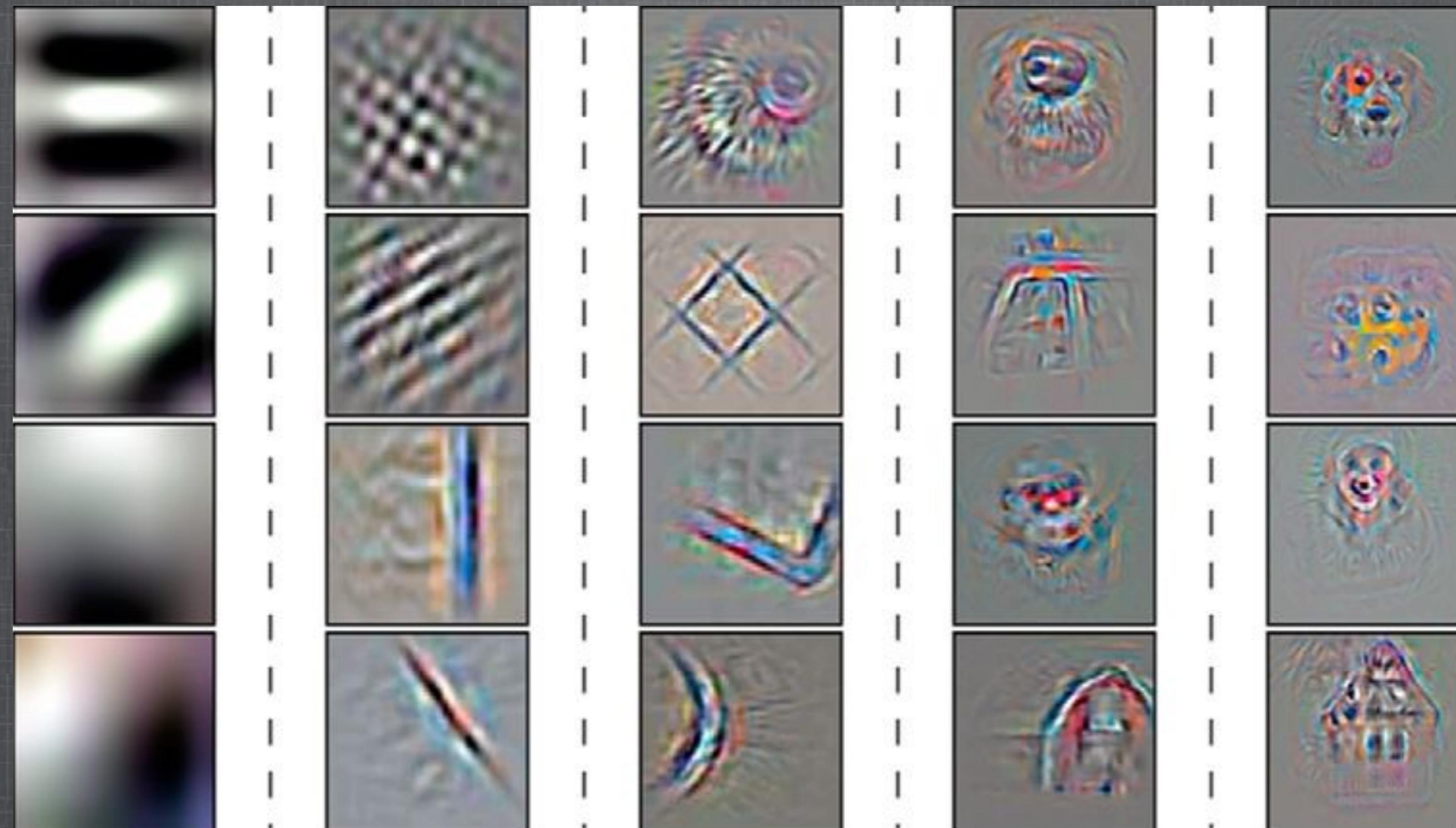


# CONVOLUTIONAL NEURAL NETWORK

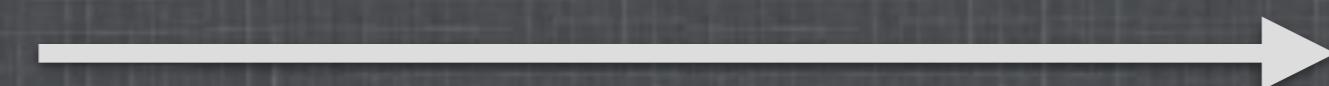
A convolutional neural network can be thought of as successive banks of feature detectors that where the neurons in layer 2 sample a field of neurons in layer 1 etc.



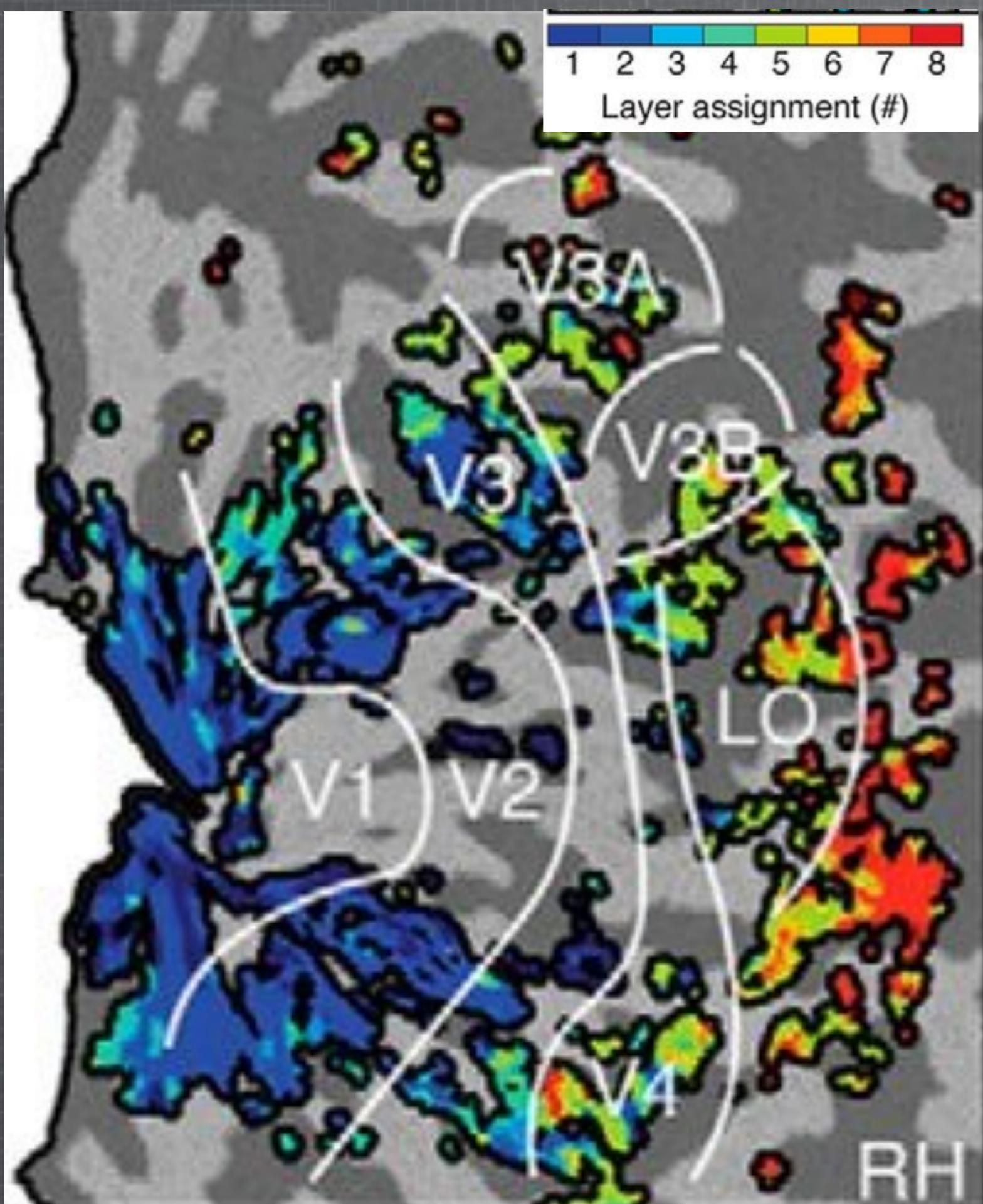
# FEATURE DETECTORS BECOME MORE COMPLEX AS YOU PROGRESS THROUGH THE LAYERS OF ARTIFICIAL “DEEP” NEURAL NETWORKS



Feature complexity



# VISUAL CORTICAL AREAS SHOW SIMILAR RESPONSE PATTERNS TO DEEP NETWORKS



Activity in human visual cortex, recorded using functional brain imaging, matches that in the different layers of an artificial deep network.

Areas earlier in the visual stream (V1, V2) match lower layers in the network that have simple features; later layers (V3, V4, LO) match higher layers with more complex features.

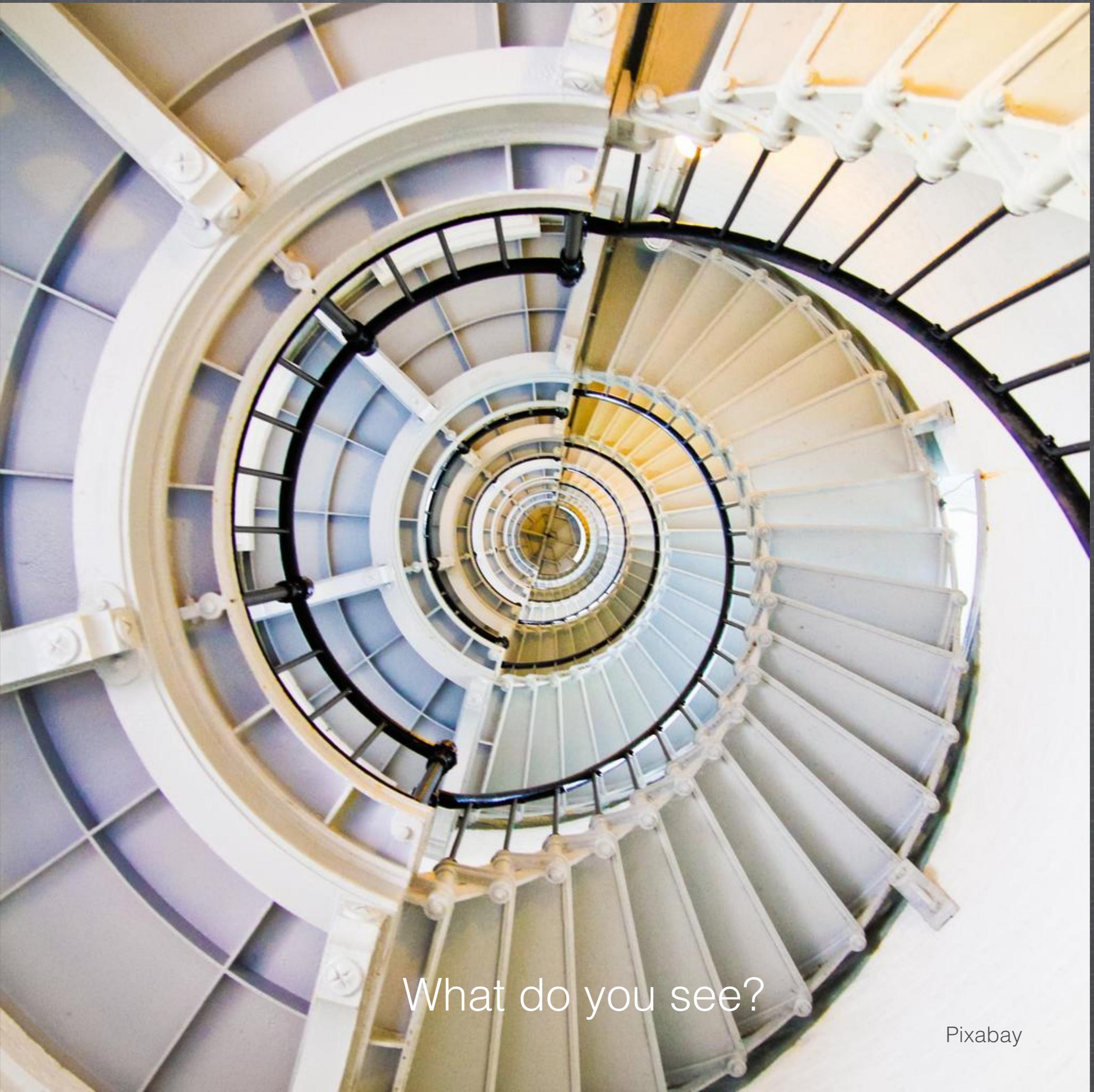
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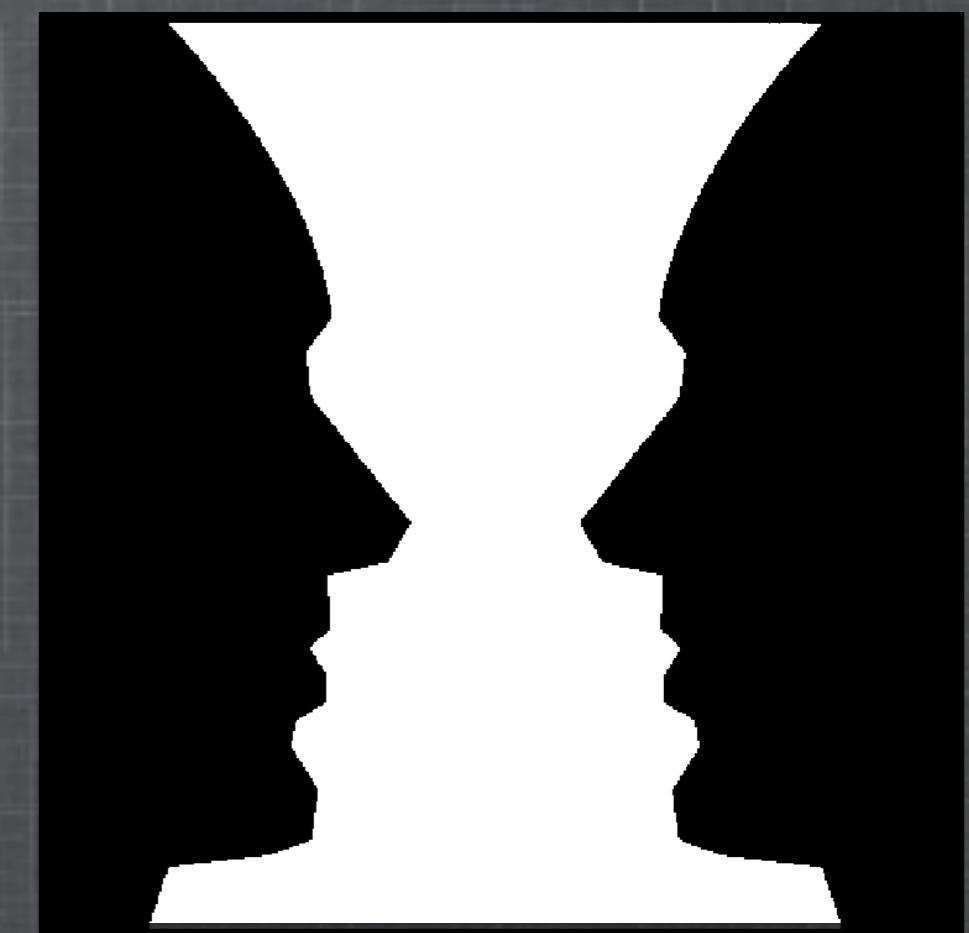
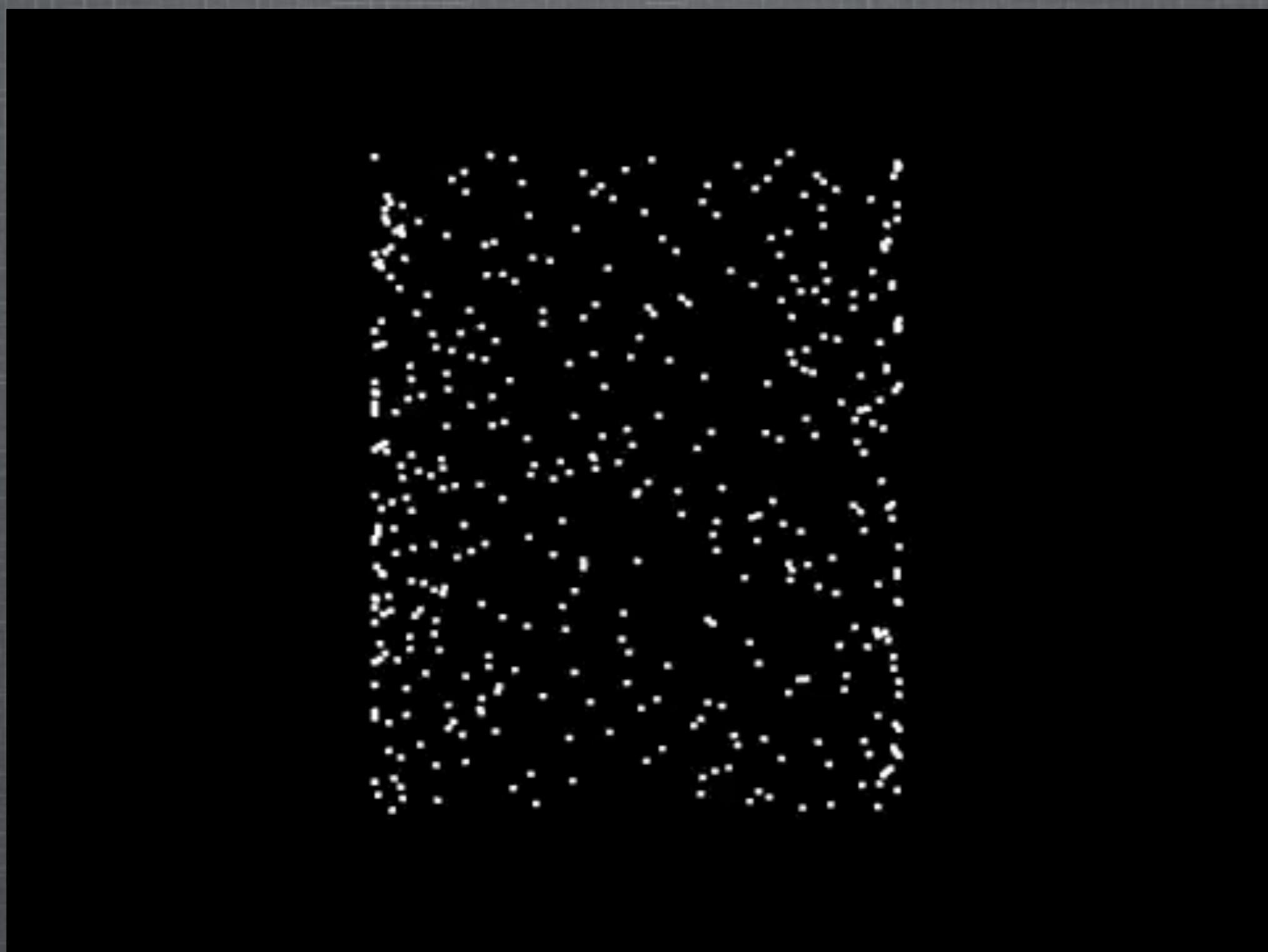
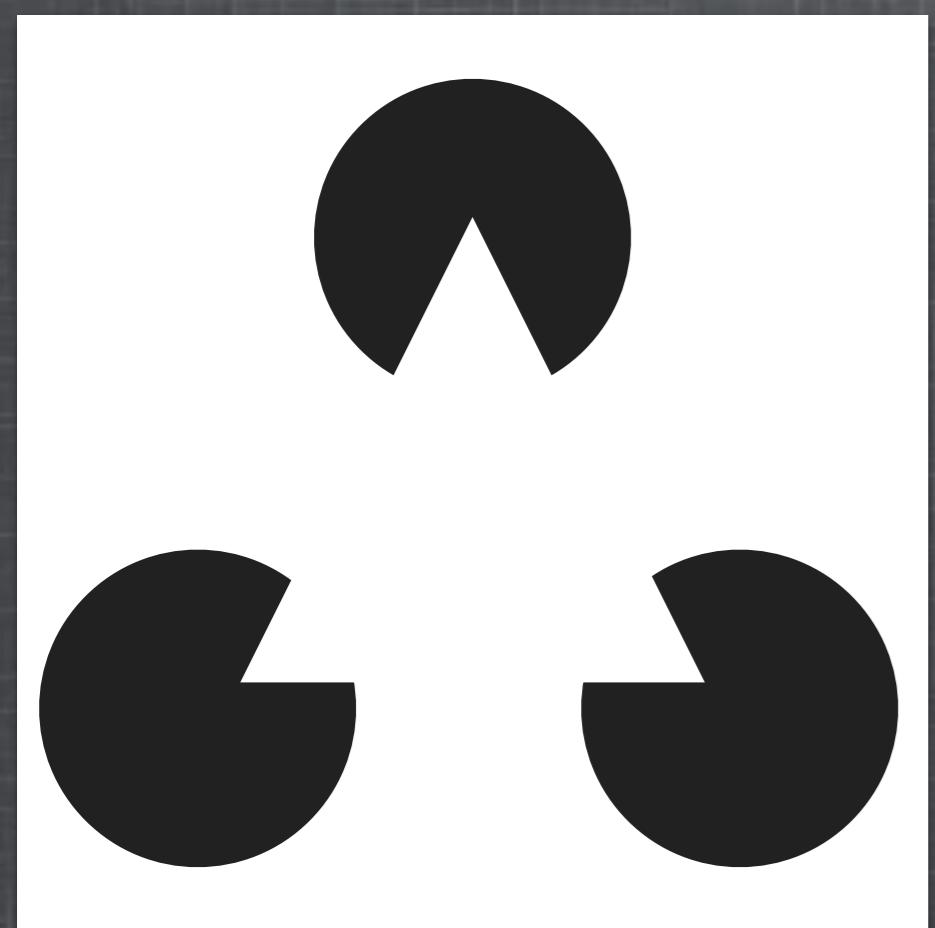


What do you see?

Pixabay



What do you see?



What do you see?



The appearance of a spiral is created by the presence of multiple discontinuous curves of reducing size

The brain likes to see continuity (complete forms)

illusions demonstrate that we don't understand the visual world the way it appears on the retina—our brains impose constraints on what we are able to perceive

# EMERGENCE



Dalmatian, photo by R. C. James

LOCAL AREAS OF THE IMAGE ARE NOT VERY INFORMATIVE



Tree



Head

Foot

Information about the complete scene must be informing the interpretation of local areas

# MULTISTABILITY

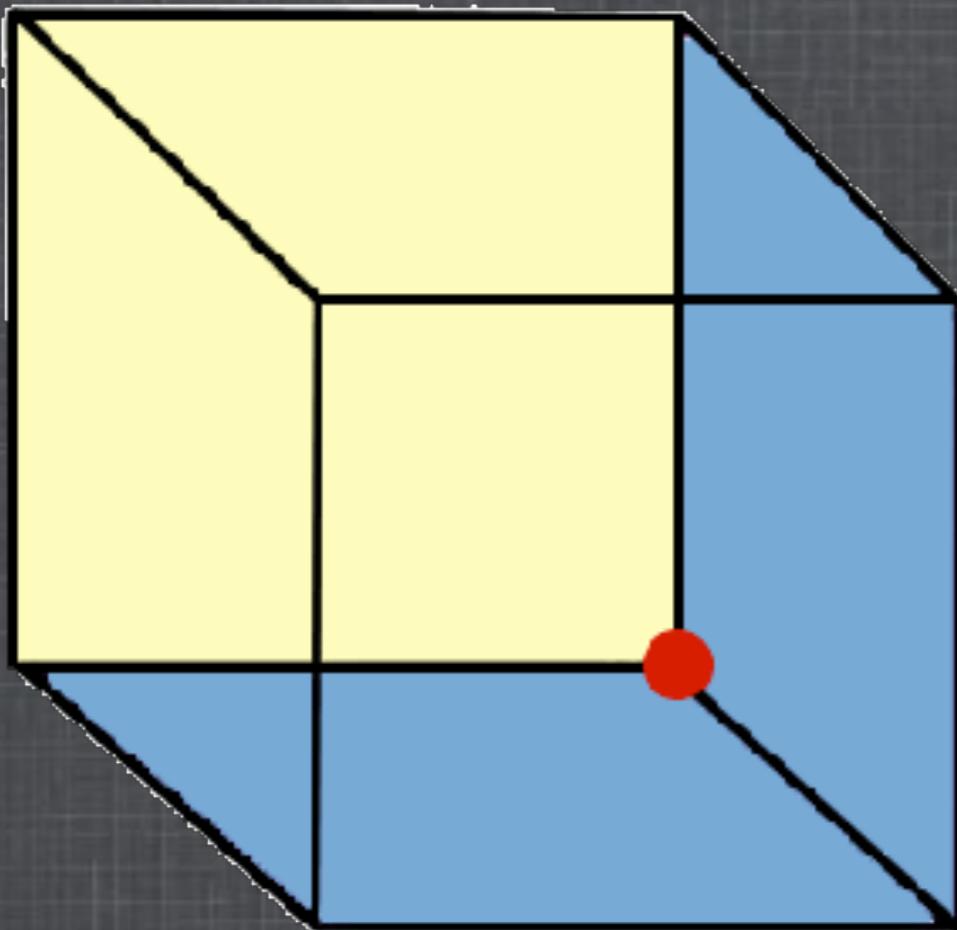
Old woman/Young woman



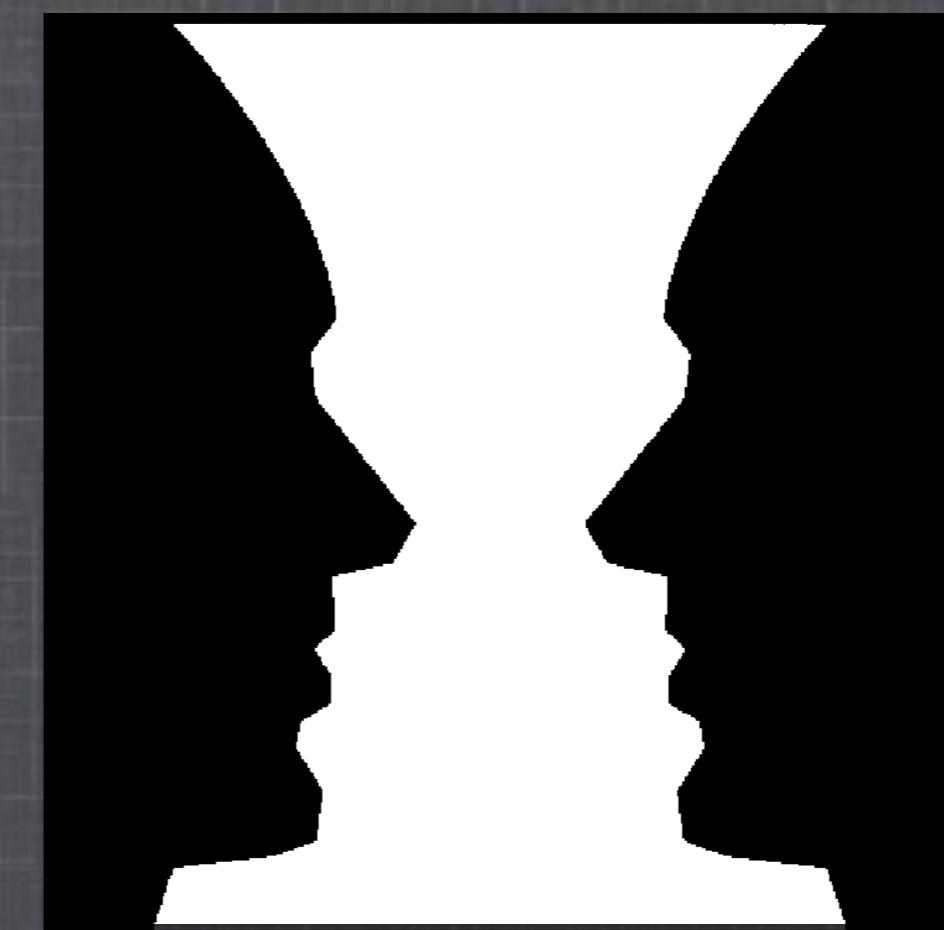
Reversible Figure/Ground Relationship



M.C. Escher

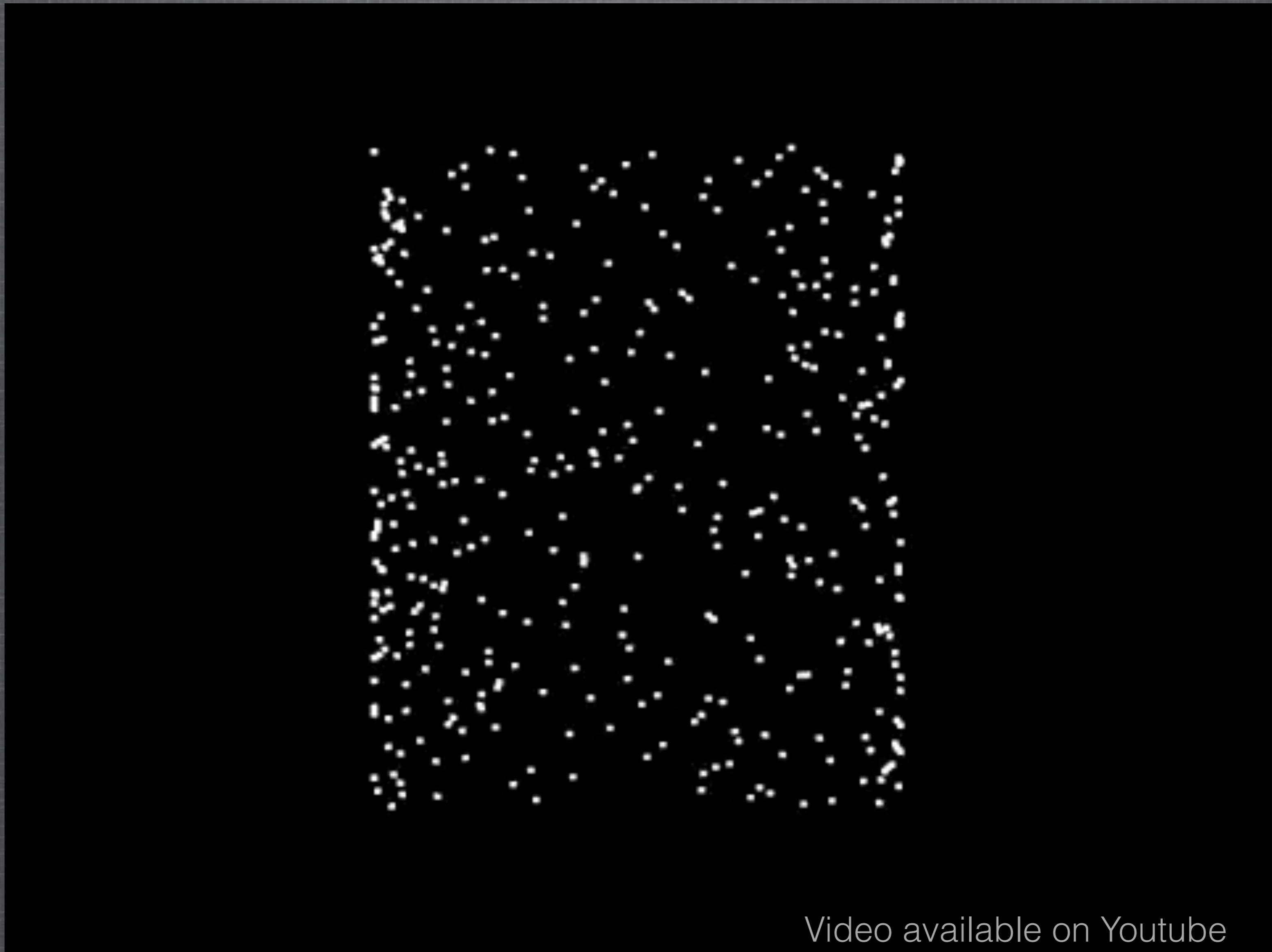


The Necker cube



Vase/heads

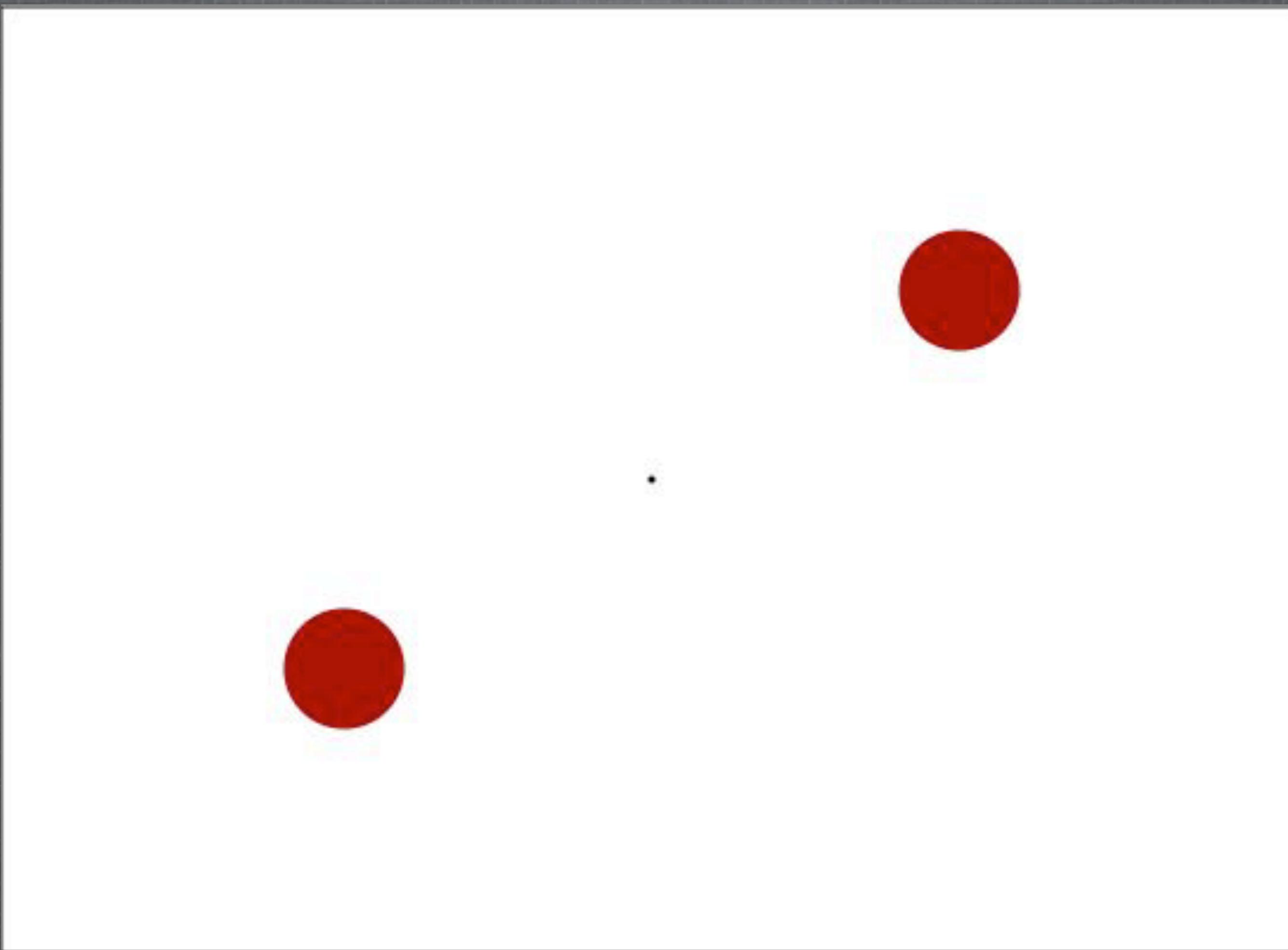
# BISTABLE PERCEPTION OF 3D MOTION



Video available on [Youtube](#)

# BISTABLE APPARENT MOTION WITH HYSTERESIS

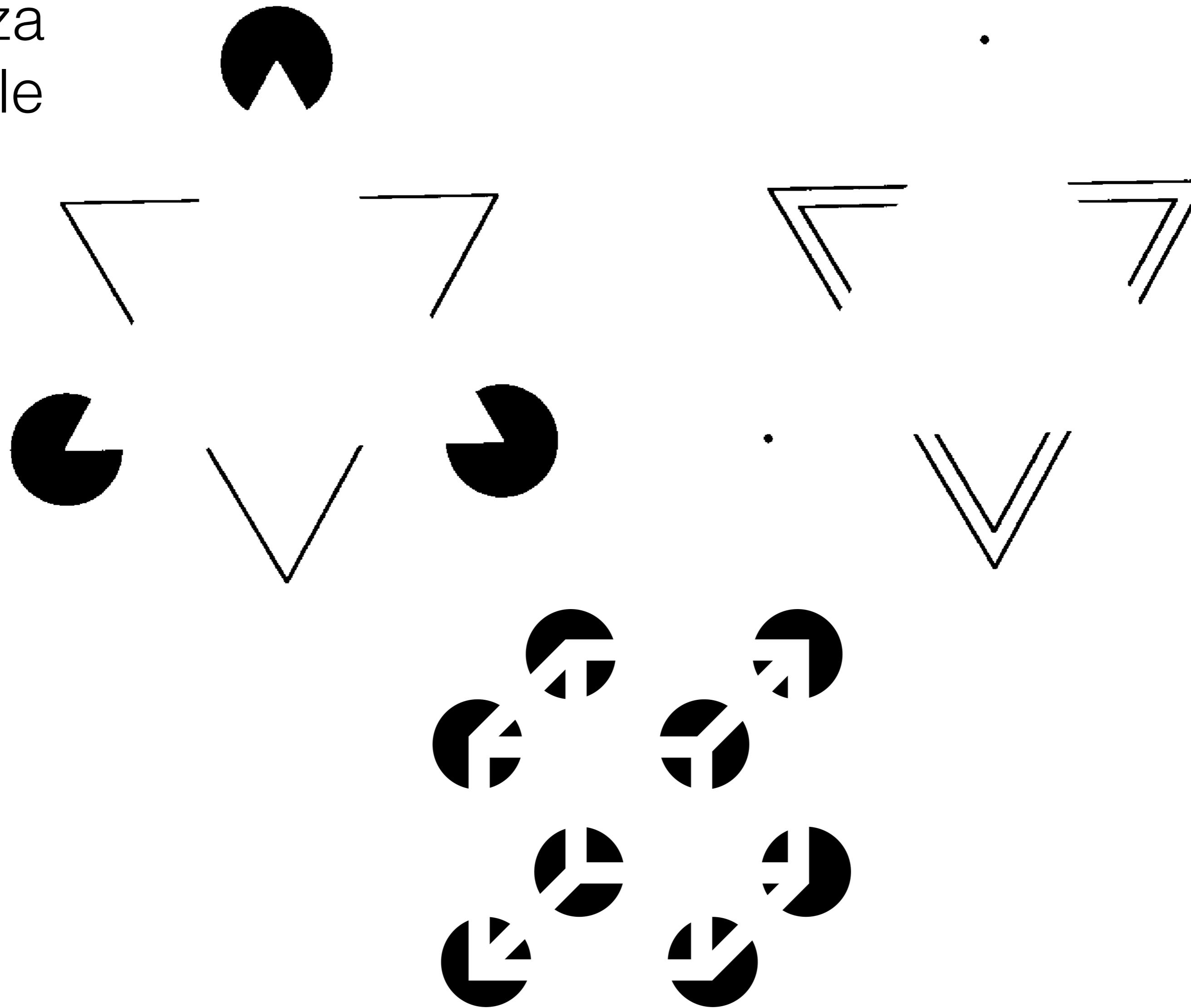
Movie from Wolfgang Tschacher



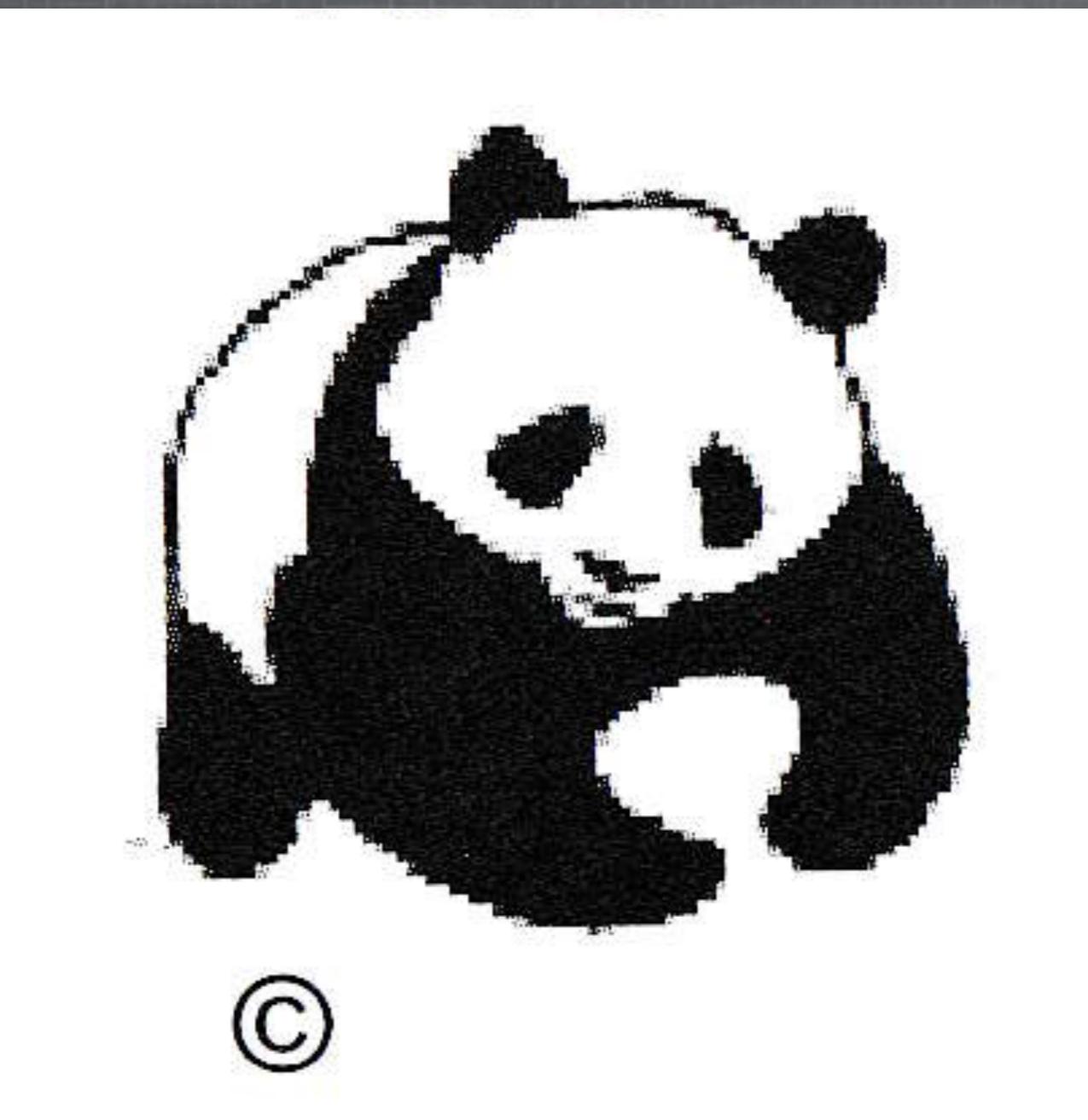
Demonstrates the Gestalt principle of proximity

# REIFICATION (RECOGNITION OF WHOLE FORMS)

Kanisza  
Triangle



# THE WORLD WILDLIFE FUND LOGO



1960s/70s



1986–

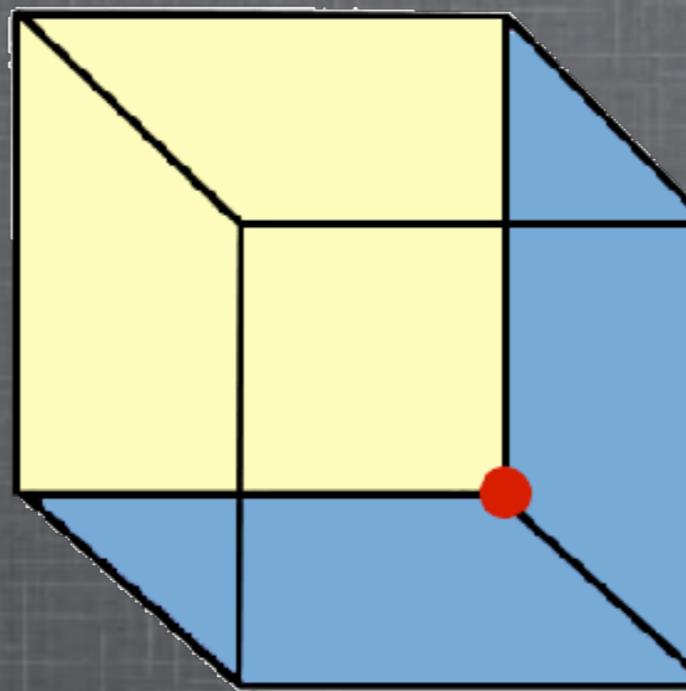
© WWF-World-wide Fund for Nature.

# GESTALT PRINCIPLES

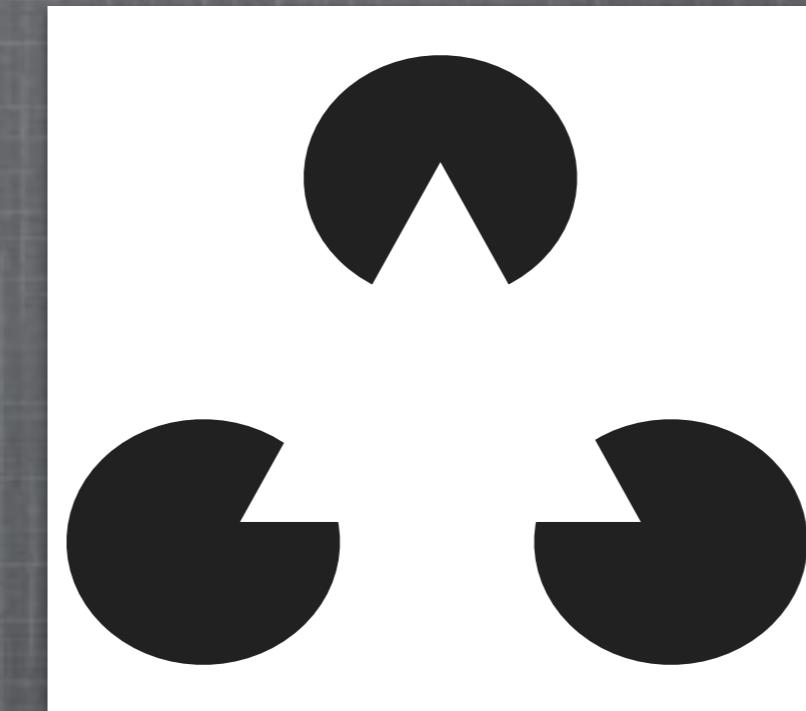
Emergence



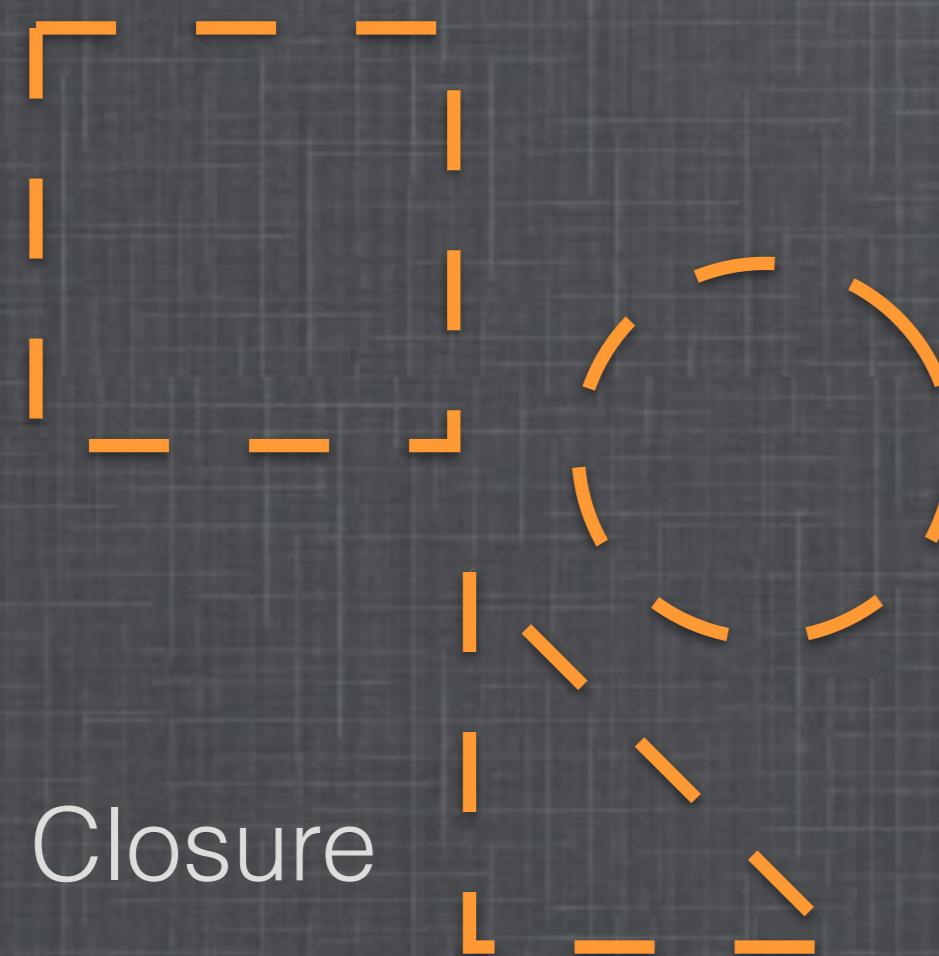
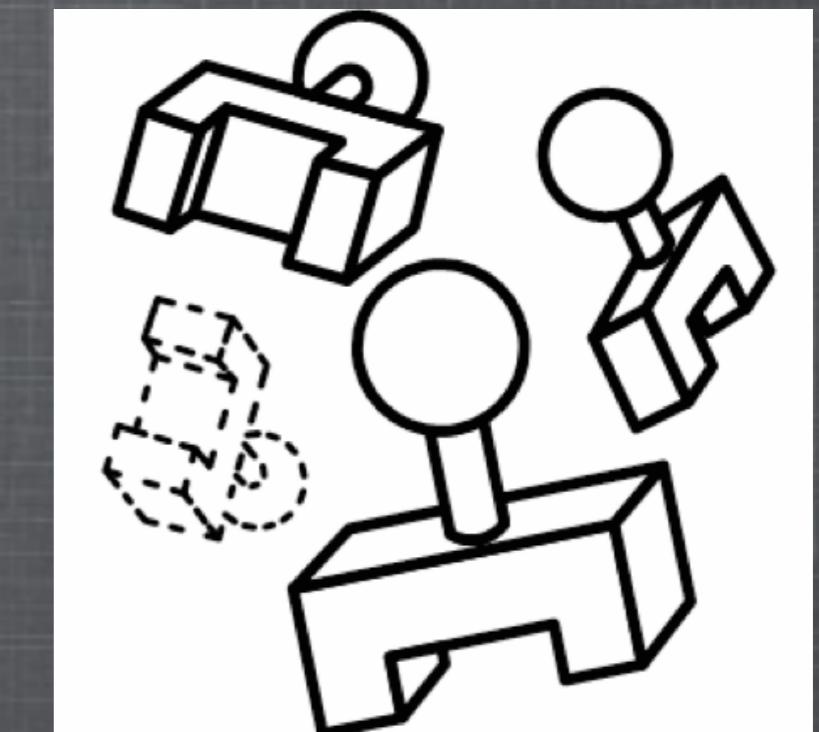
Multistability



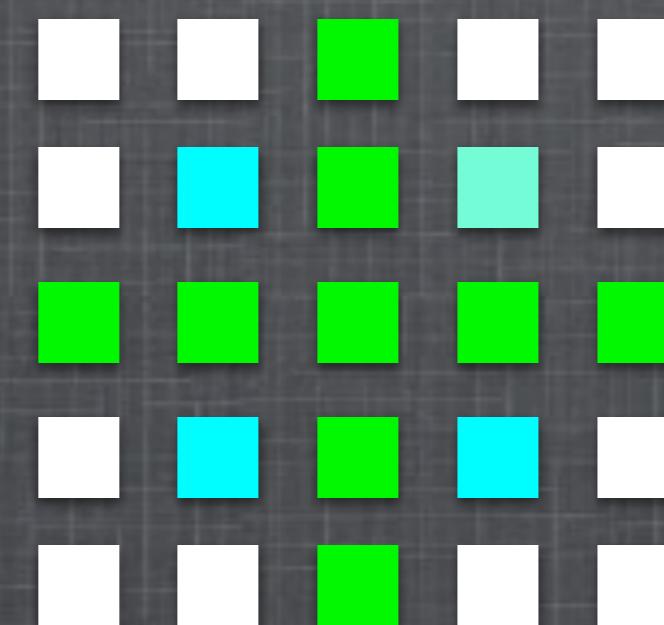
Illusory contours  
(Reification)



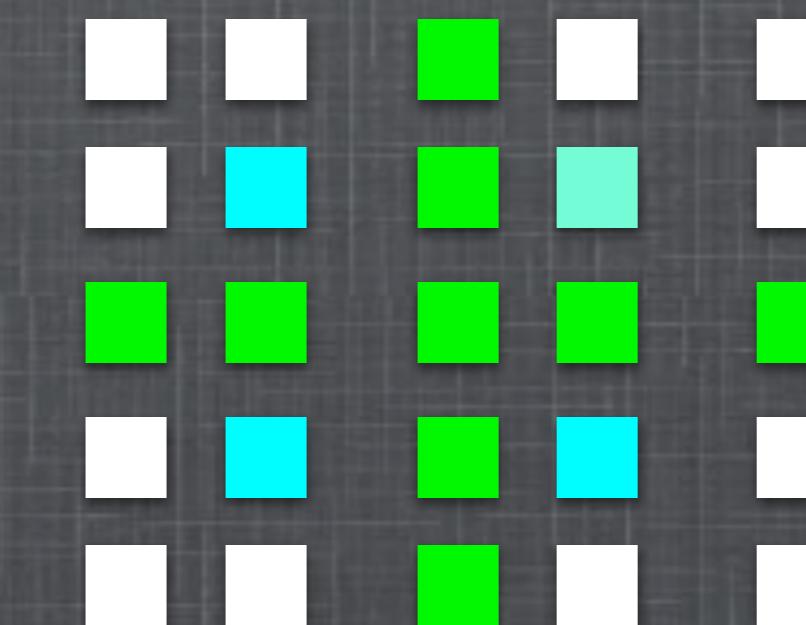
Invariance



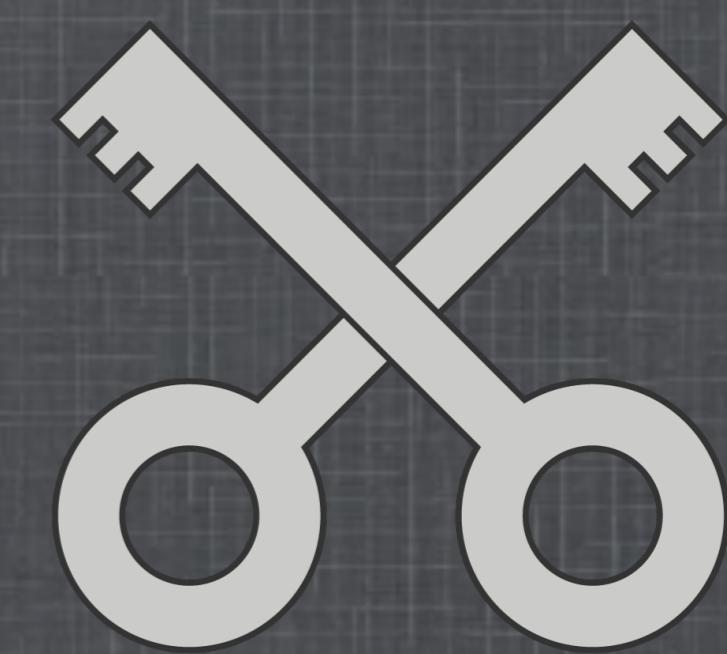
Closure



Similarity



Proximity



Continuity

These constraints were noted by the Gestalt Psychologists in the early 20th c.

# INTERIM SUMMARY

- The “inner screen” theory of vision fails because there is no “inner eye” to inspect the inner screen
- The retinotopic maps in our brain are upside-down, flipped L->R, and distorted
- The brain extracts multiple forms of information about vision including separate streams for “what” and “where” information
- As you ascend the “what” pathway neurons respond to increasingly complex features from edges to faces and places
- The responses of cells in the different layers of the visual system can be usefully compared to those of artificial neurons found in deep convolutional networks
- Our brain uses powerful principles to build percepts including closure, similarity, proximity, and continuity