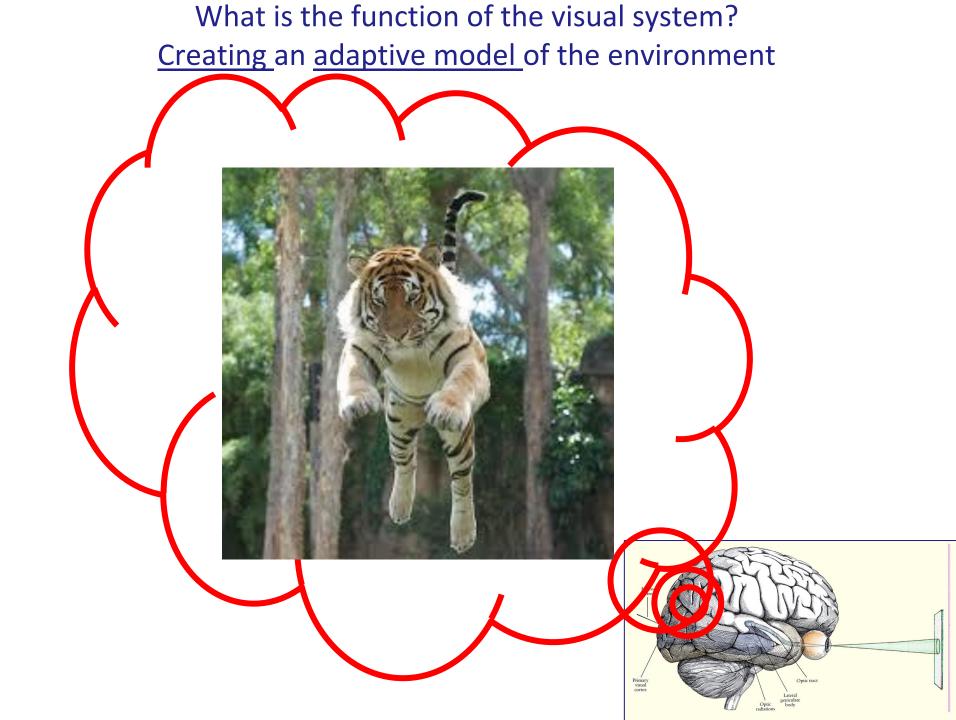
Introduction to Neuroscience: Systems Neuroscience

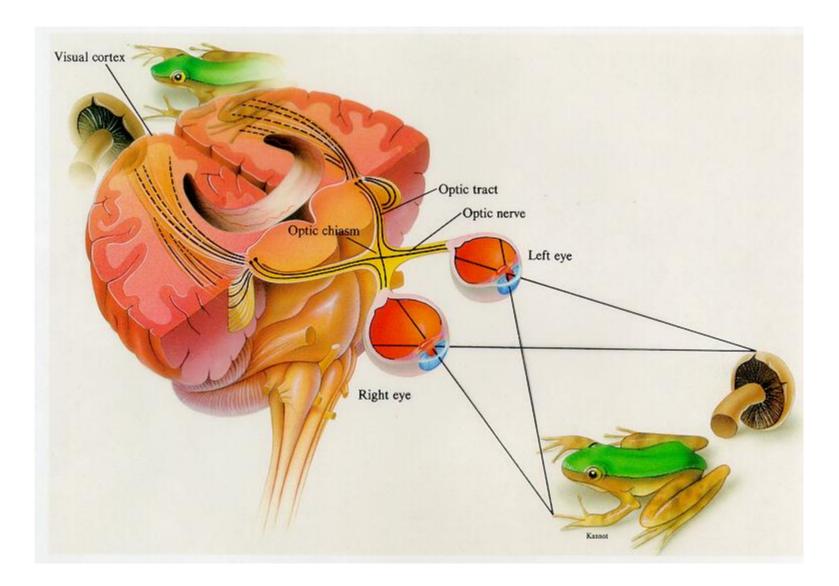
Central visual processes

Rafi Malach

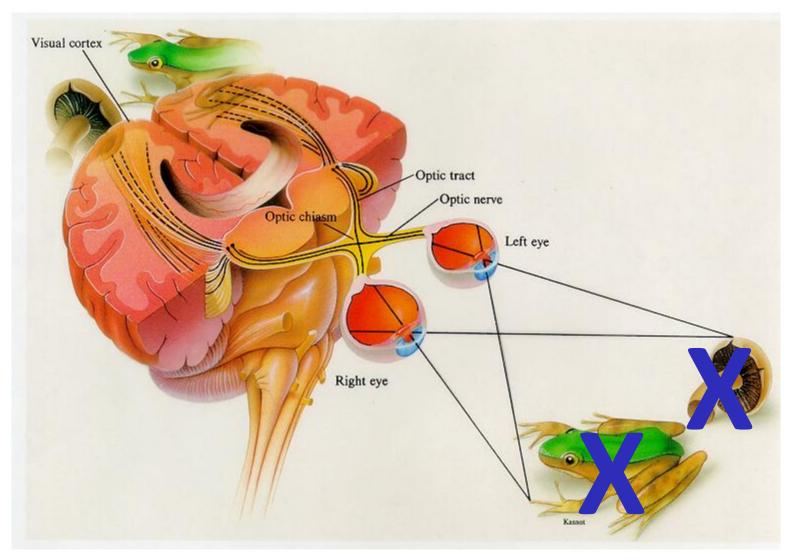
**Department of Brain Sciences** 



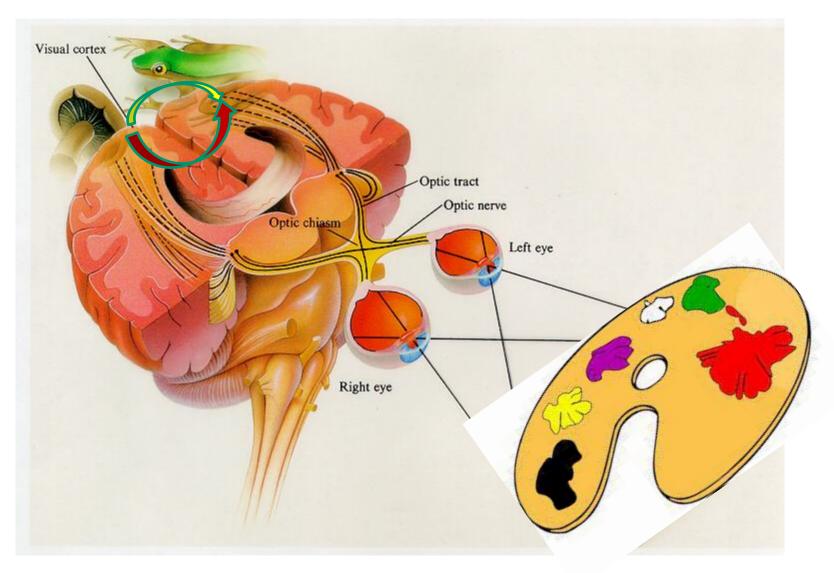
### The representation model of visual perception



# We do not see the external environment- only the model our visual system generates

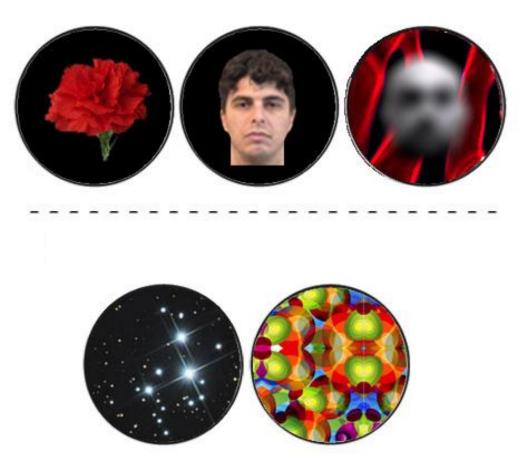


The external reality is infinite and incomprehensible- our vision selects from it materials with which it constructs its model





### Totally blind individuals can see vivid visual images The Charles Bonnet Syndrome

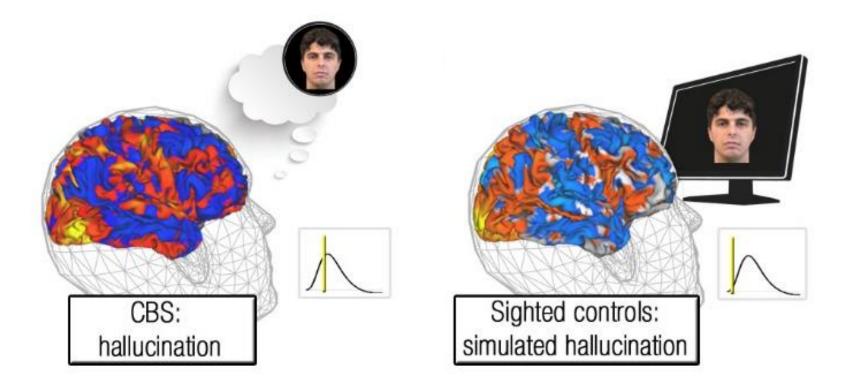


### Examples of visual hallucinations in late- blind individuals

Avital Hahamy, Marlene Behrmann



The visual system is activated during hallucinations similarly to normal vision



Avital Hahamy et. al.

### <u>Creating an adaptive model of the environment</u>

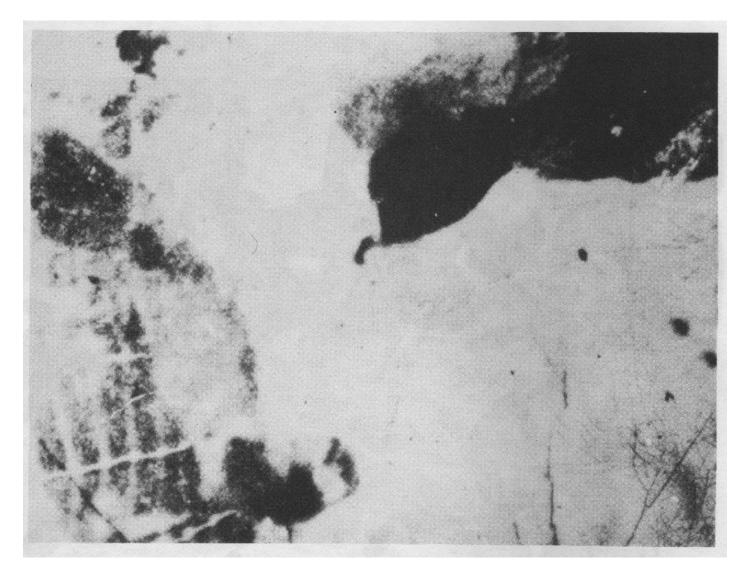
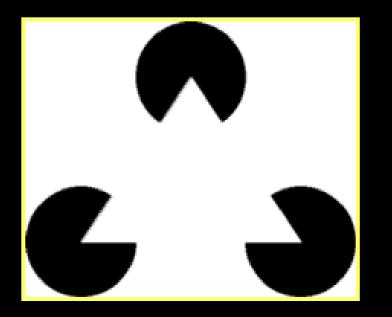


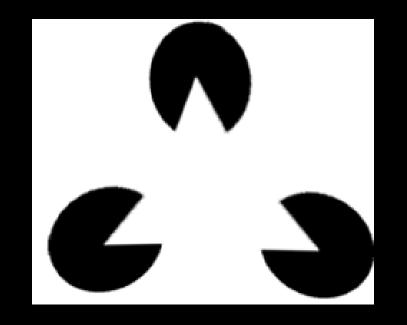
Illustration of the creative and adaptive nature of vision

### Illusory Shapes contradict external information

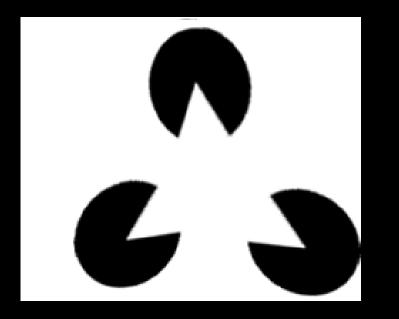


The Kanizsa Triangle

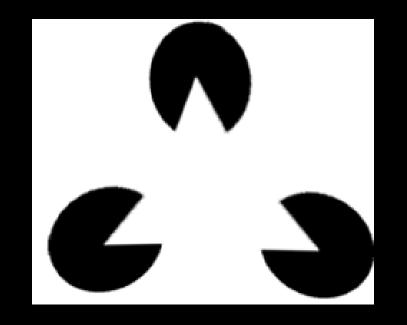
### The motion illusion



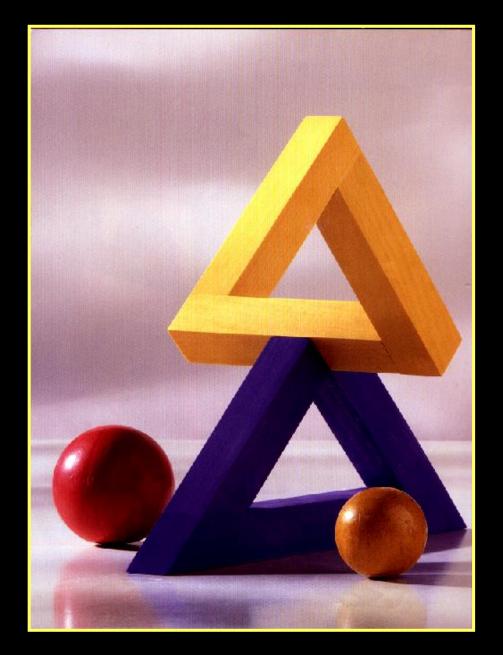
### The motion illusion



### The motion illusion



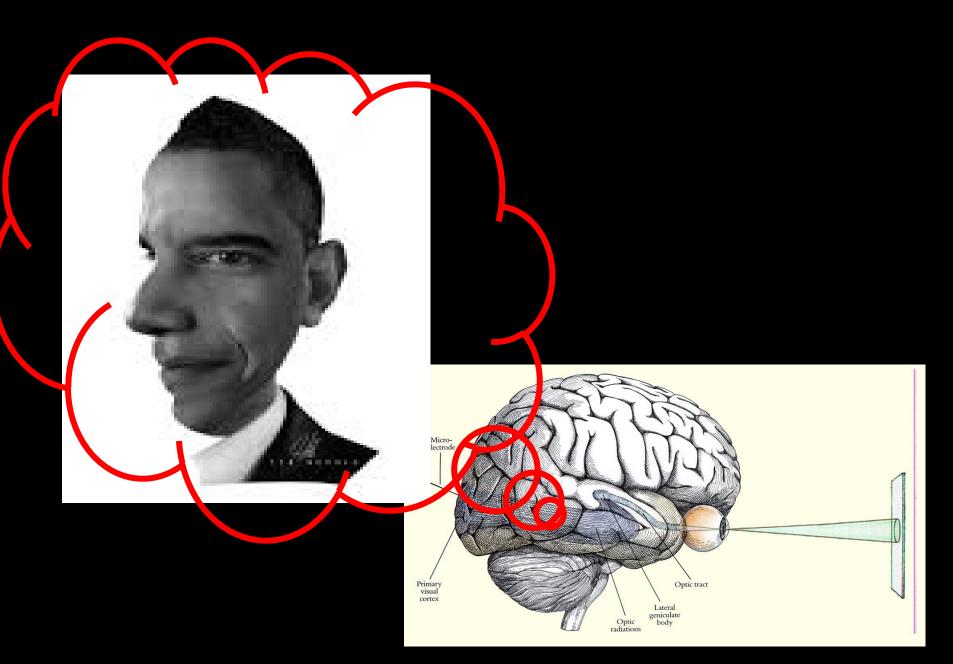
### The visual system can create models of objects that can not possibly exist



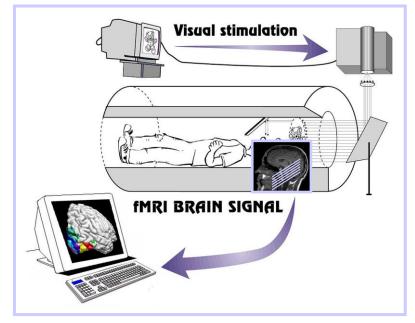
### **Interim Summary**

- Sensory perception is not the formation of a copy or representation of the external world
- The purpose of perception is to create a model of the world that helps us function effectively

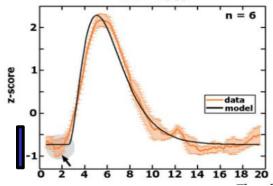
### The neuronal process underlying visual perception



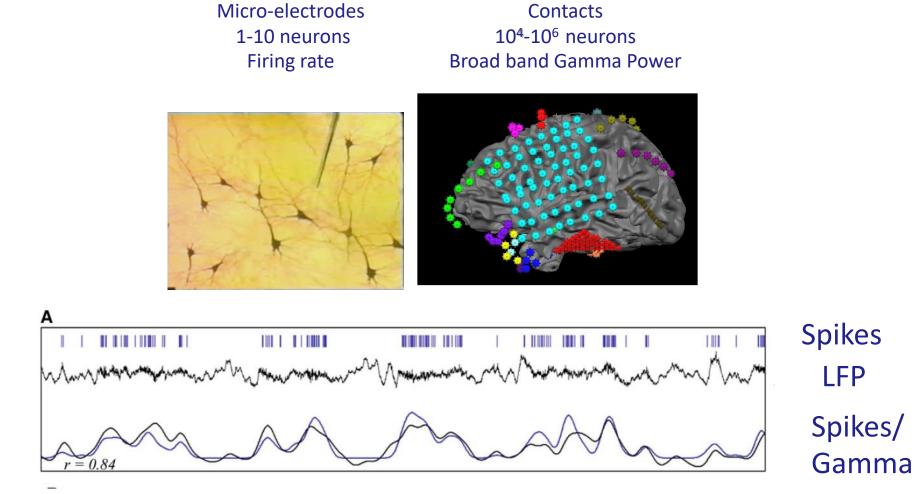
#### **The Methods** Functional Magnetic Resonance Imaging 10<sup>5</sup>-10<sup>6</sup> neurons Hemodynamic Signal





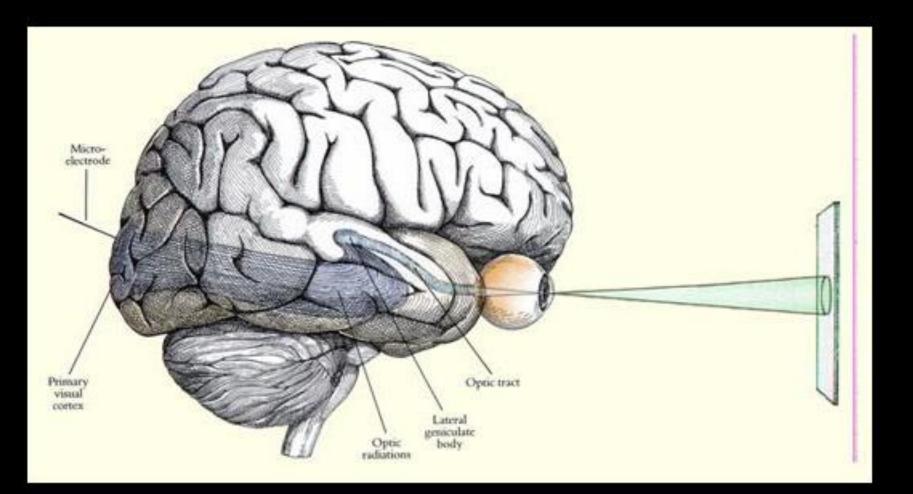


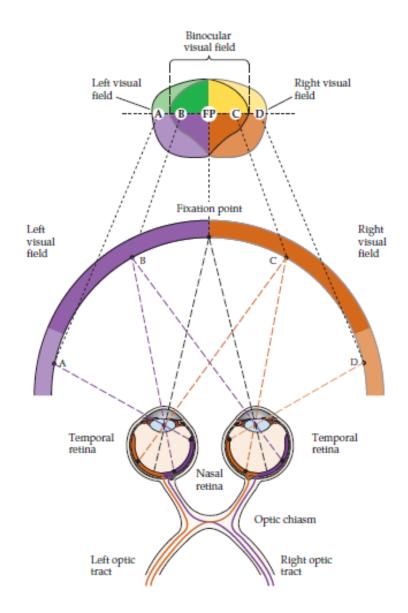
### Electrophysiology



Firing rate= amplitude of fast (Gamma) fluctuations

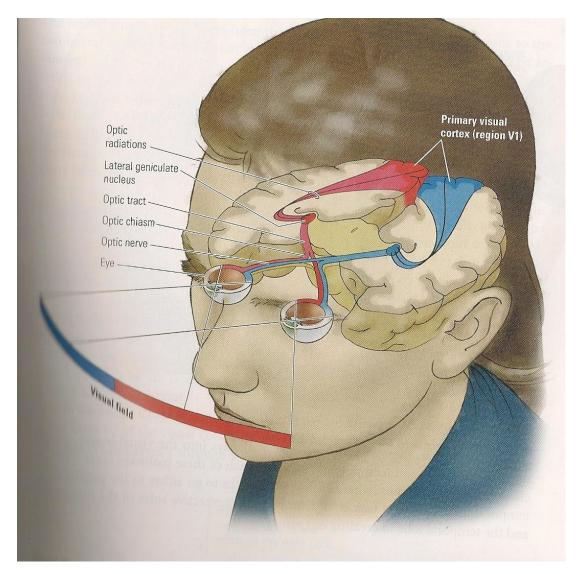
### The flow of visual information in the human brain





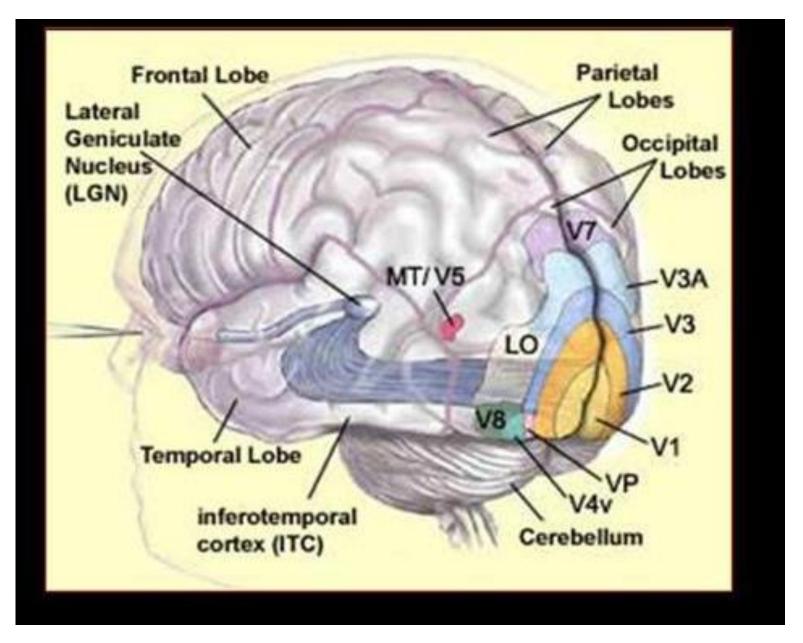
retinotopy, visual field, contra- ipsi, fixation point, vertical meridian Horizontal meridian

### Flow of information form the eye to the brain



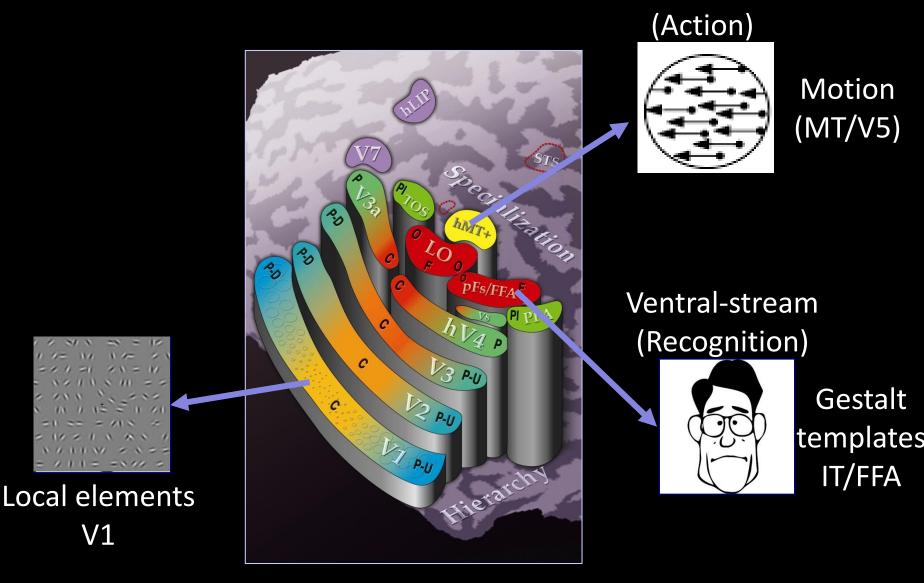
Optic nerve, chiasm, partial crossing, tract and radiation

#### Atlas of human visual areas

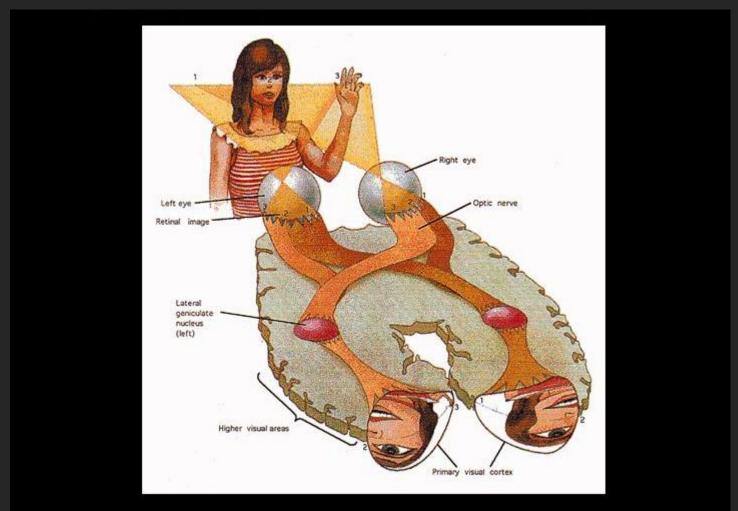


### Functional Selectivity in the Human Visual Cortex

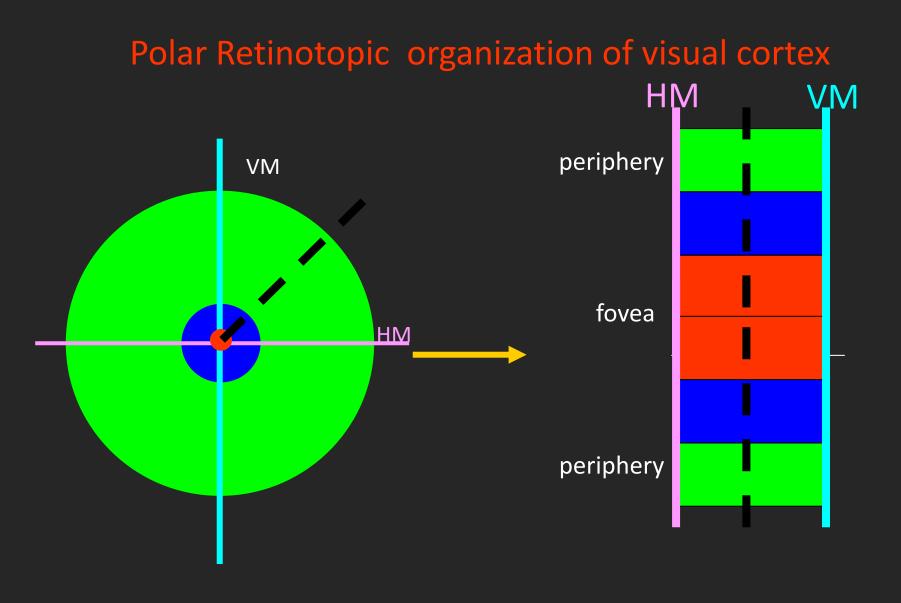
**Dorsal-stream** 



# Large scale organizational principles of V1 Retinotopy

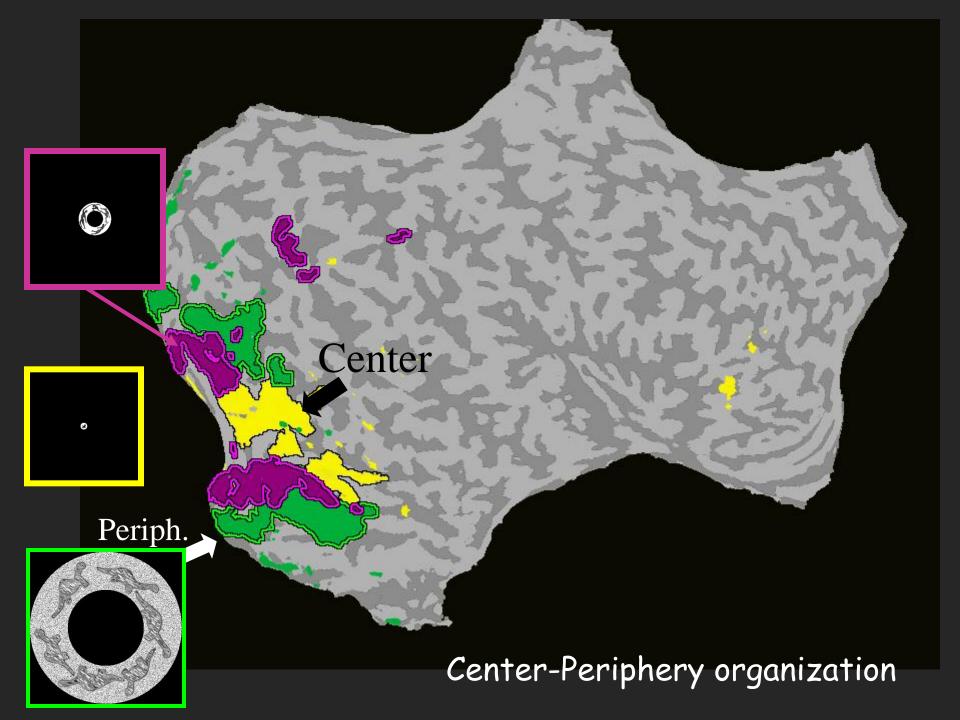


#### Mmagnification factor- mm cortex/visual angle



# WORLD

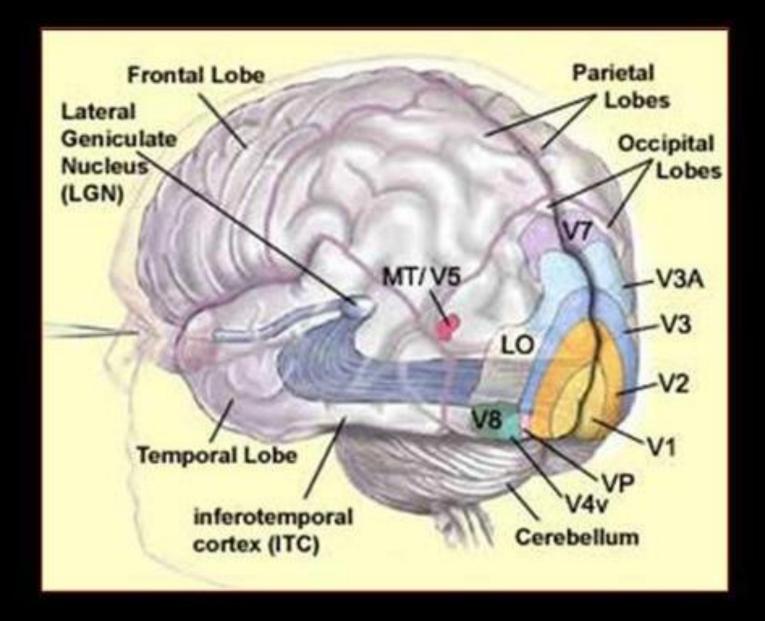




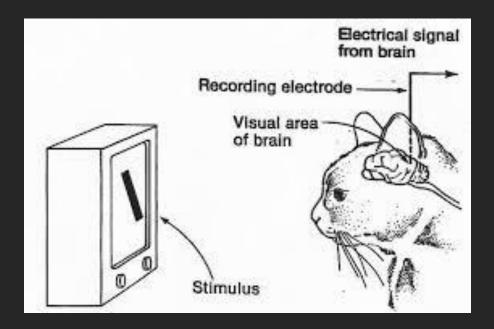
### **Interim Summary**

- The early, retinotopic, stages in the visual system consist of multiple representations of the visual field- organized as parallel bands on unfolded cortex
- Three major principles of organization:
- 1) Magnification factor- the central visual field activates a larger number of neurons
- 2) Center-periphery organization- central vision is in the center
- 3) Polar angle organization- right visual field in the left hemisphere, upper visual field in ventral cortex

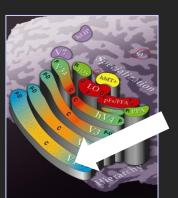
### The functional transformations along the visual pathways



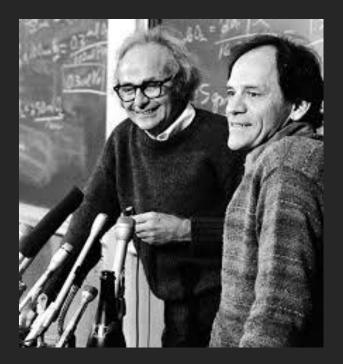
### The transformation from the LGN to V1



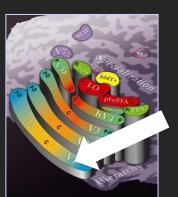
The properties of single neurons in area V1



### The properties of single neurons in area V1



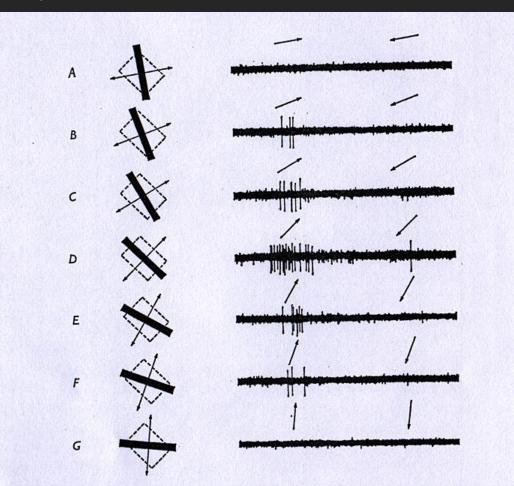
### David Hubel and Torsten Wiesel



# The properties of single neurons in area V1

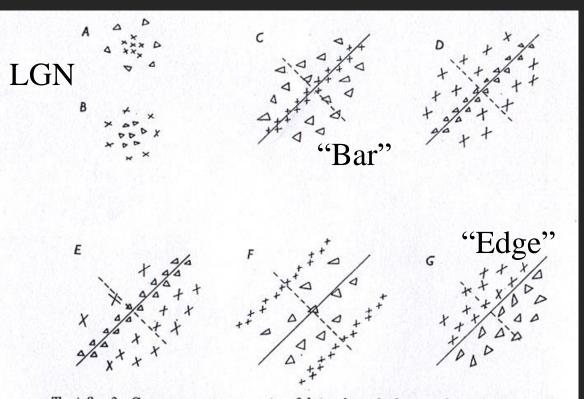


#### Receptive field of a visual neuron in area V1



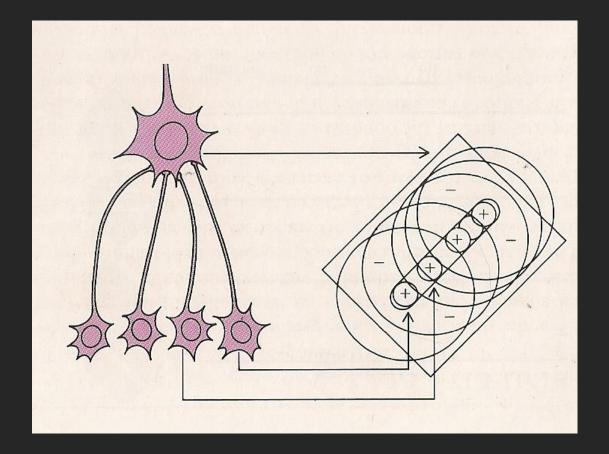
Text-fig. 2. Responses of a complex cell in right striate cortex (layer IV A) to various drientations of a moving black bar. Receptive field in the left eye indicated by the interrupted rectangles; it was approximately  $\frac{3}{8} \times \frac{3}{8}^{\circ}$  in size, and was situated 4° below and to the left of the point of fixation. Ocular-dominance group 4. Duration of each record, 2 sec. Background intensity 1.3 log<sub>10</sub> cd/m<sup>2</sup>, dark bars 0.0 log cd/m<sup>2</sup>.

# Stimulus selectivity of receptive fields Receptive field of a "Simple" cell in area V1



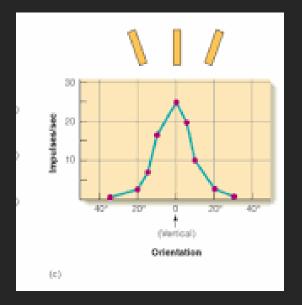
Text-fig. 2. Common arrangements of lateral geniculate and cortical receptive fields. A. 'On'-centre geniculate receptive field. B. 'Off'-centre geniculate receptive field. C-G. Various arrangements of simple cortical receptive fields.  $\times$ , areas giving excitatory responses ('on' responses);  $\triangle$ , areas giving inhibitory responses ('off' responses). Receptive-field axes are shown by continuous lines through field centres; in the figure these are all oblique, but each arrangement occurs in all orientations.

### The simple cell model



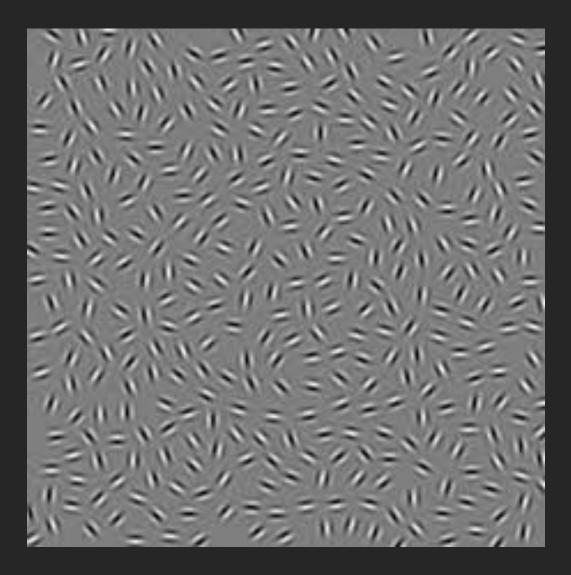
Convergence, threshold, synchrony an "and" function

## What is the function of the oriented line detectors?

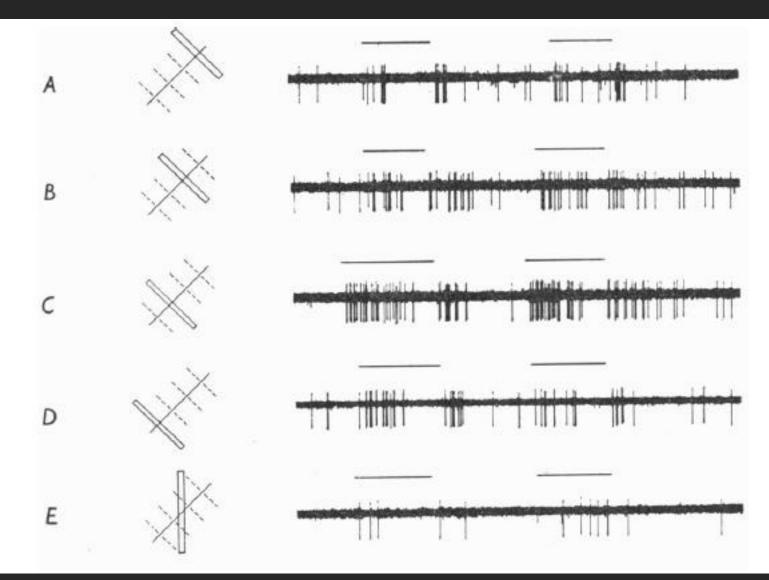




# Perceptual saliency of line detection

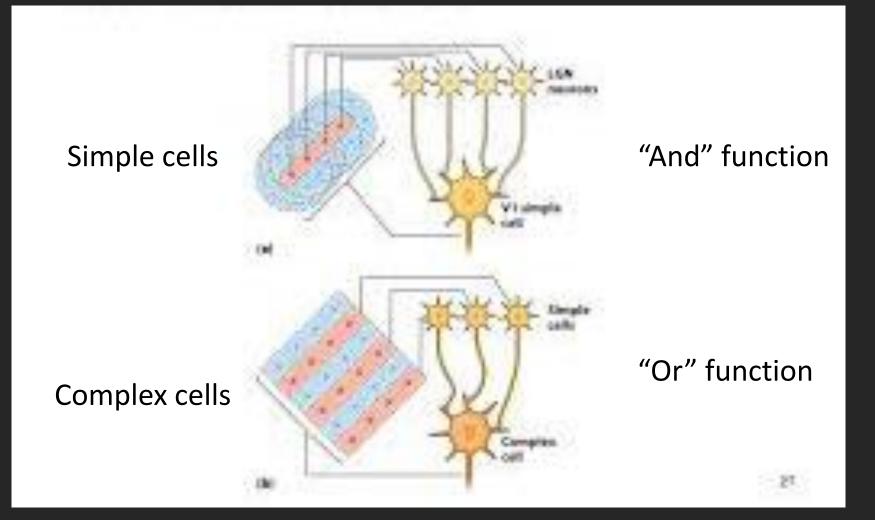


### Functional Hierarchy within V1



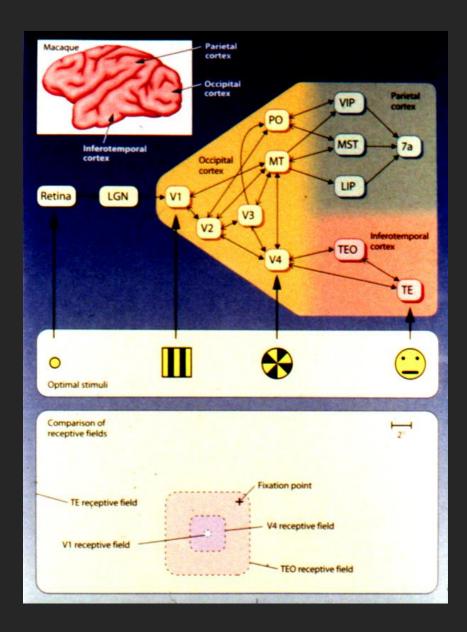
complex cells

### Functional hierarchy within V1



The transformation from simple to complex cells

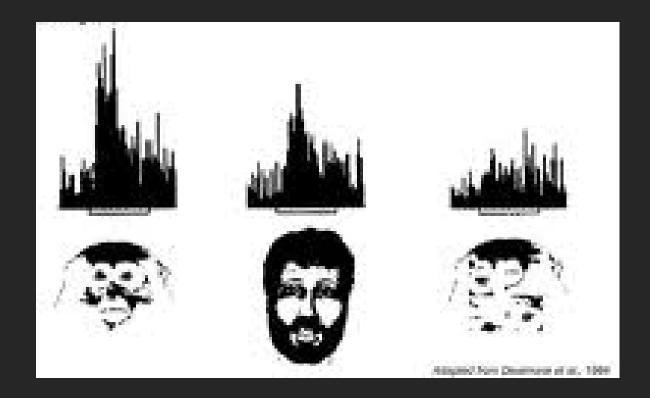
Growing "abstraction" along the visual hierarchy



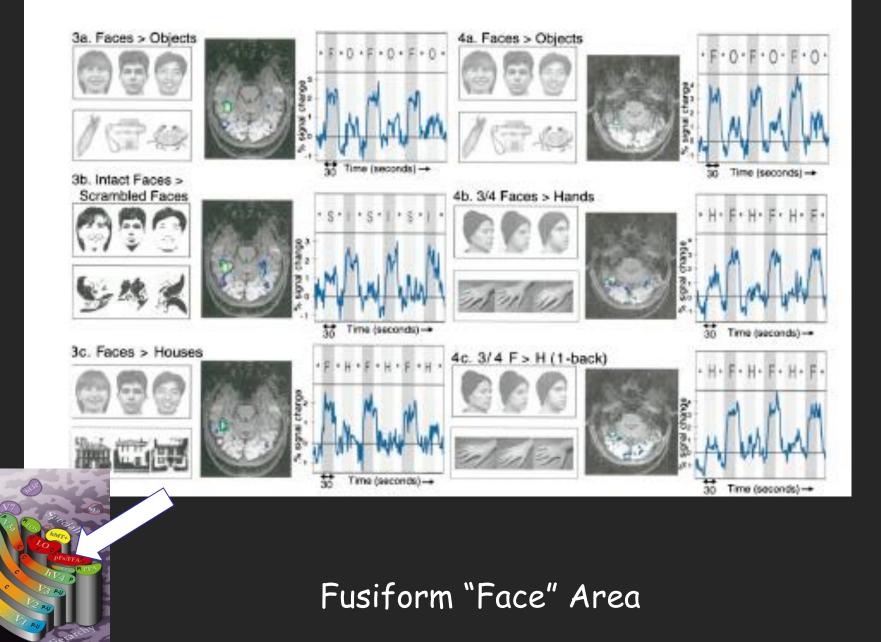
### Increased complexity

Increased RF size

### Complex templates at the top of the VENTRAL stream



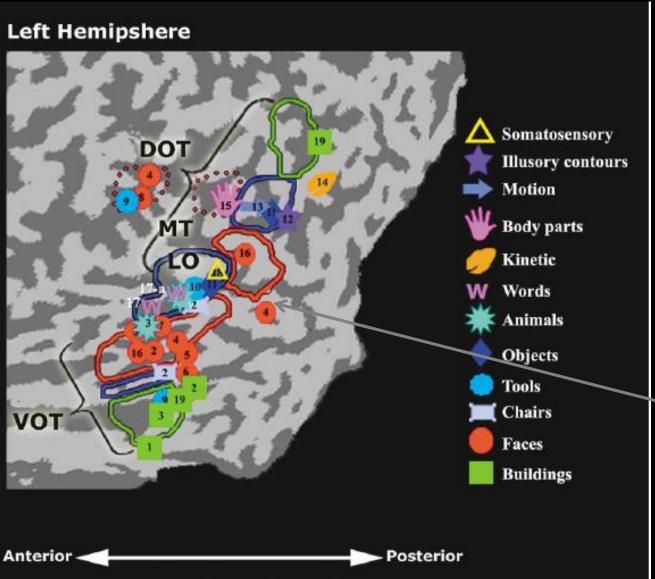
## "Face" neurons

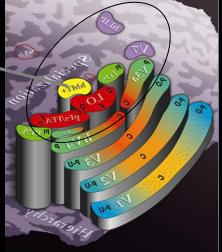


# Electrical stimulation of the fusiform face area

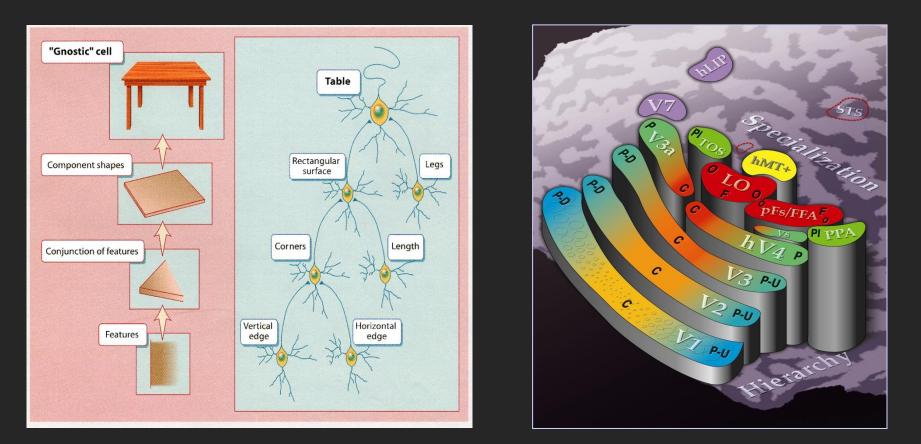


# Mosaic of category-selective cortical regions





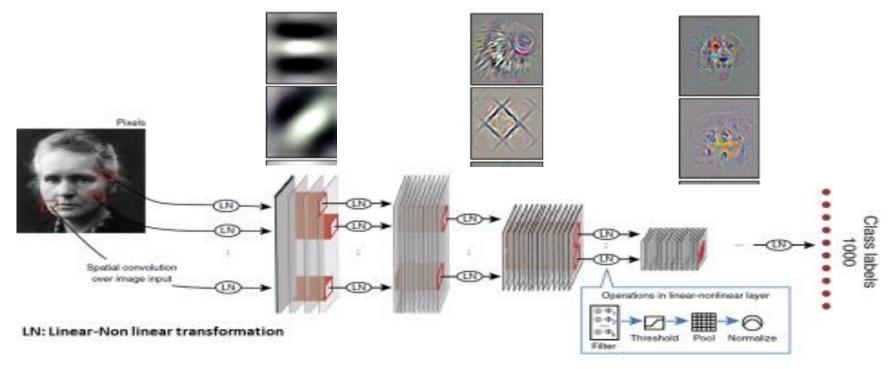
### How are the functional transformations implemented?



Repeating the feed-forward simple cell model along the hierarchy

# Deep Convolutional Neural Network:

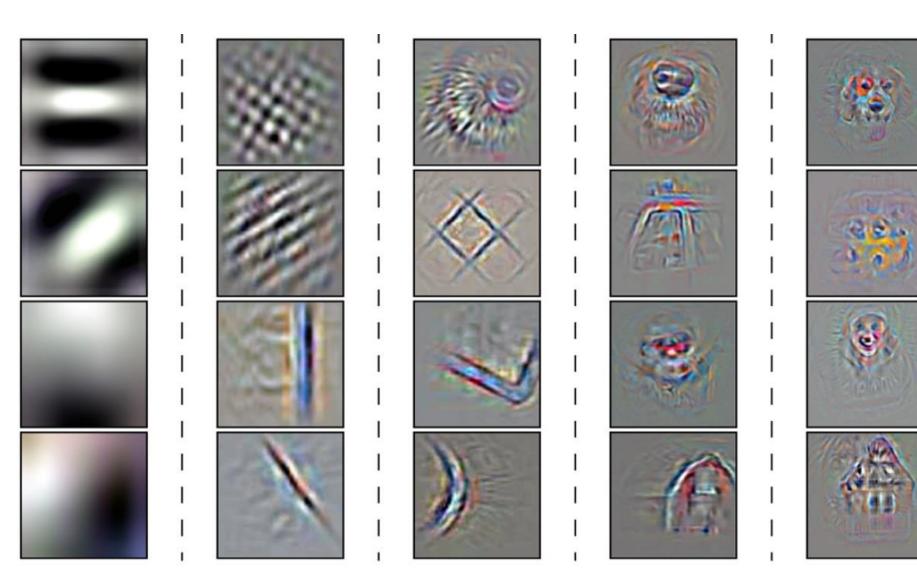
A successful hierarchical model of human visual performance



Yamin and DiCarlo, 2016 Guculu and Van Gerven, 2015

Artificial networks now out-perform human visual recognition capabilities

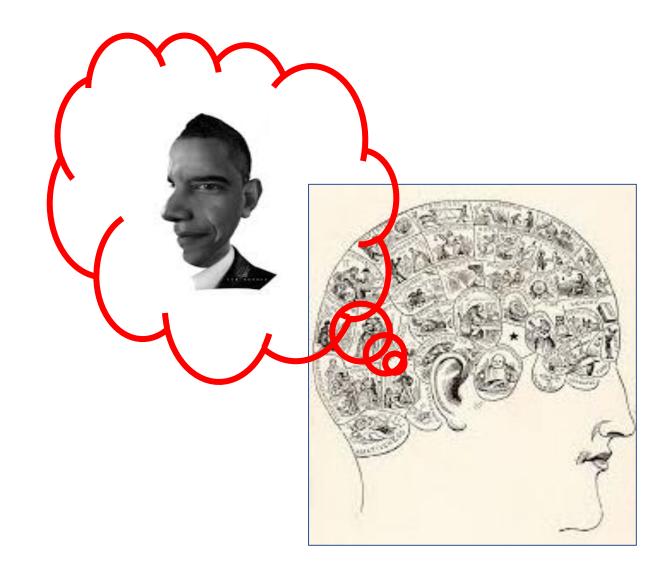
### Receptive fields of artificial neurons along the hierarchy



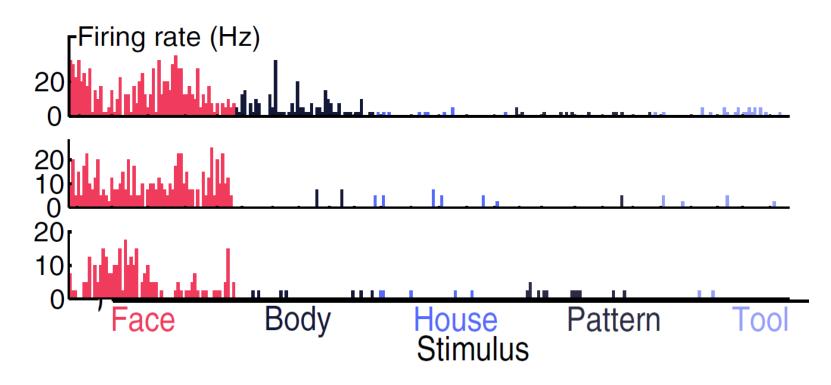
### **Interim Summary**

- The visual pathway consists of a series of functional transformations
- Characteristics of the transformation:
- 1) Increasingly holistic from picture elements to entire percepts organized in categories
- 2) Increasingly invariant- reduced sensitivity to position in the visual field
- 3) The transformation is implemented through selective convergence of inputs combined with a decision non-linearity (e.g. the LGN- to simple cell transformation)
- 4) Extending the principle can account for functional properties along the visual hierarchy
- 5) Supported by artificial networks

What is the neuronal code underlying the images in the visual system?



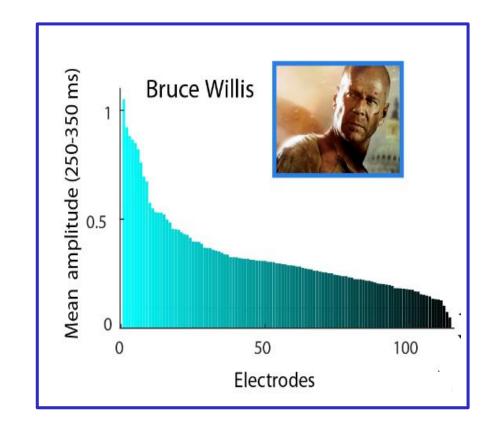
### First code: tuning of single neurons



Widely distributed responses Unique face tuning of each neuron

Simon Khouvis

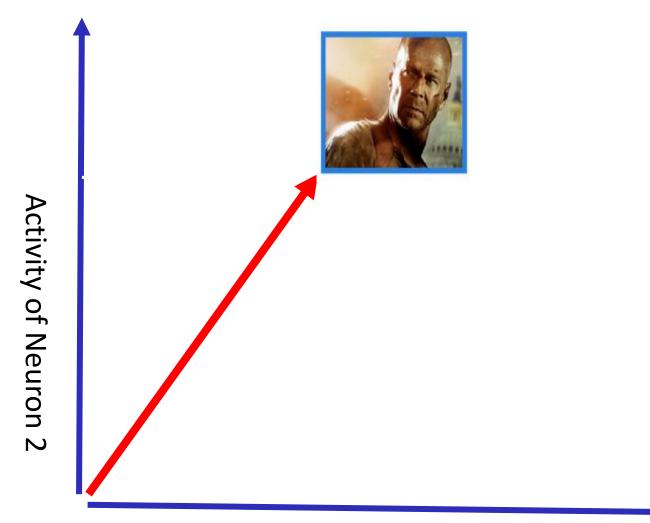
### Second code: population vector



### Multi-unit activation pattern to each visual image

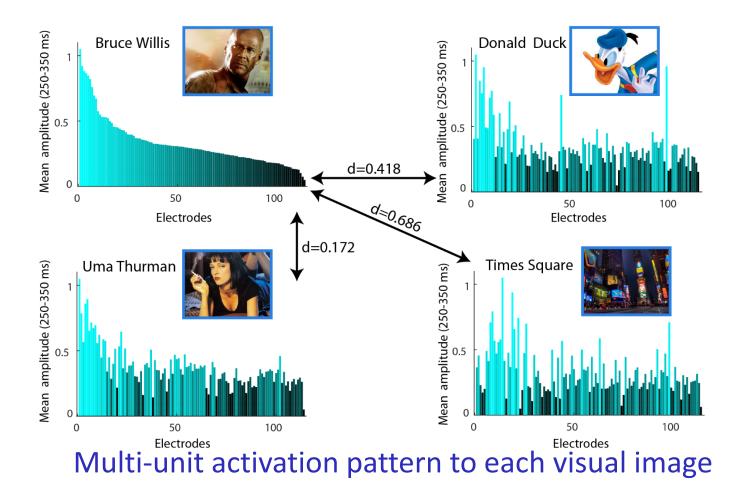
Yitzhak Norman, Rotem Broday-Dvir

### The population vector

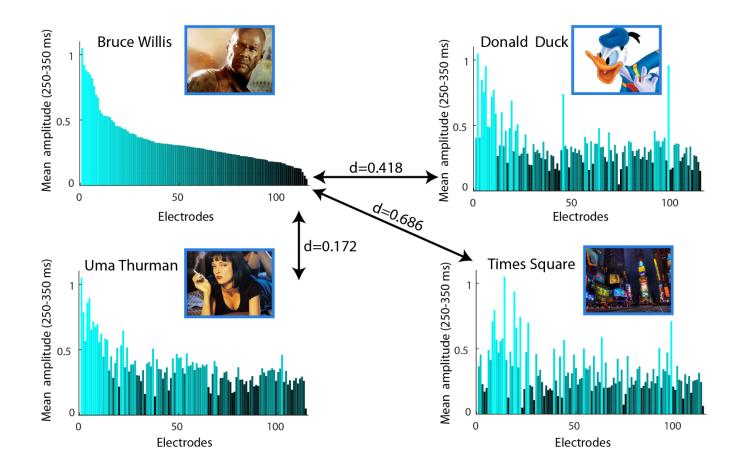


Activity of Neuron 1

### Second code: population vector



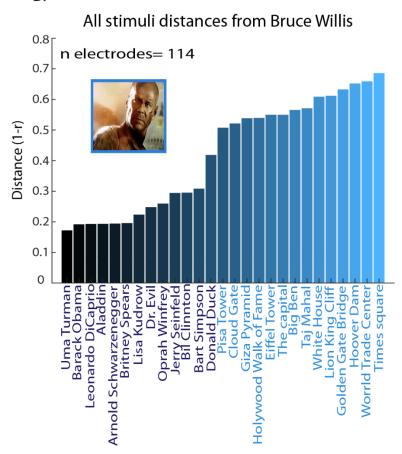
### Third code: relational coding



The image is coded by the similarity of its activation pattern to other patterns

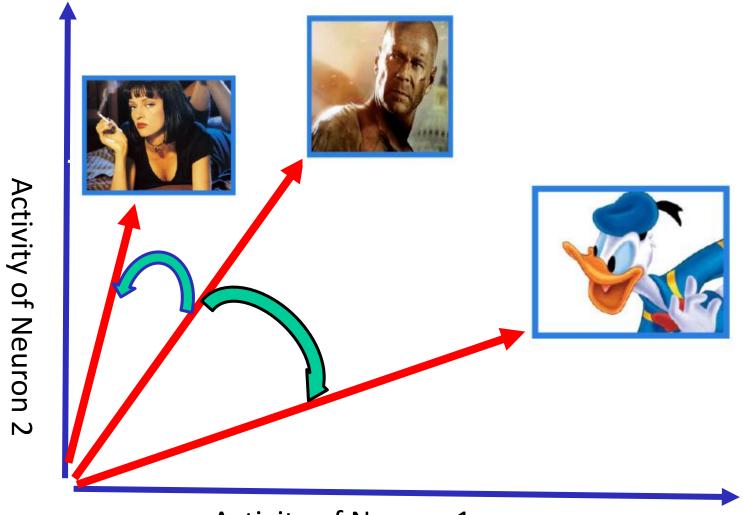
### Third code: relational coding

Β.



The image is coded by the similarity of its activation pattern to other patterns

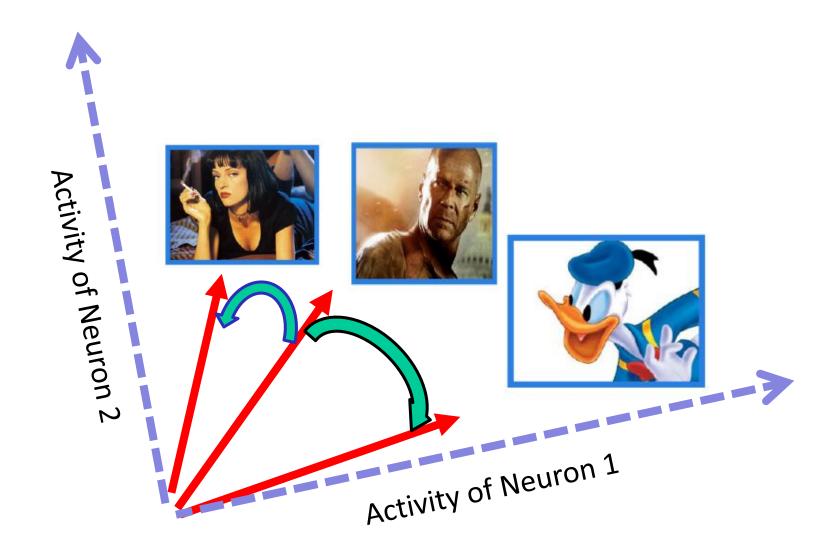
### **Third Code: Relational coding**



Activity of Neuron 1

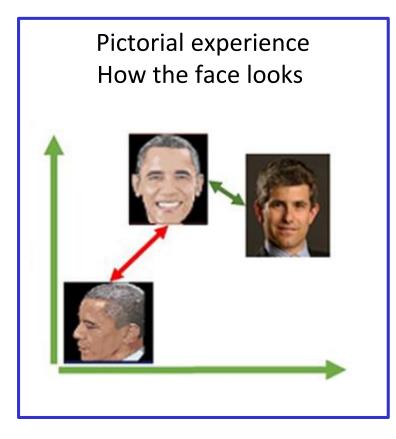
The image is coded by the angles formed between the population vectors

### **Third Code: Relational coding**

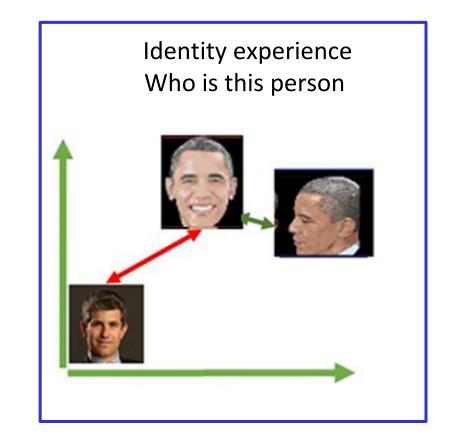


Relational coding is not dependent on the single neuron tuning or magnitude

Different relational synaptic structures are associated with different categories of conscious experiences



View-point sensitivity



### View-point invariance

# Measuring relational coding in the brain Representational Similarity Analysis (RSA)

### **Neural distances matrix**

Different activation patterns (long distance)

Similar activation patterns (short distance)

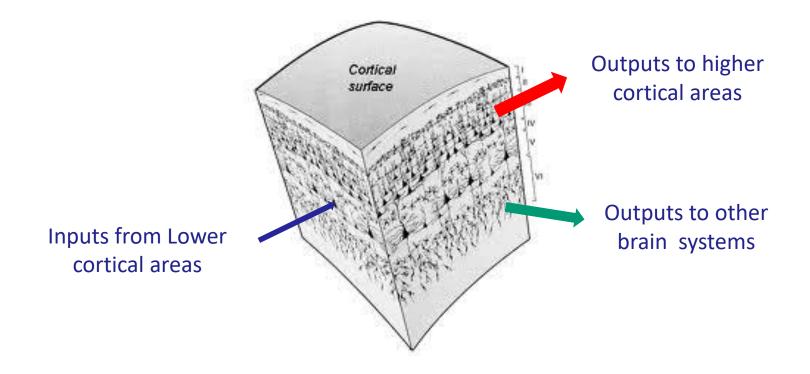


### **Interim Summary**

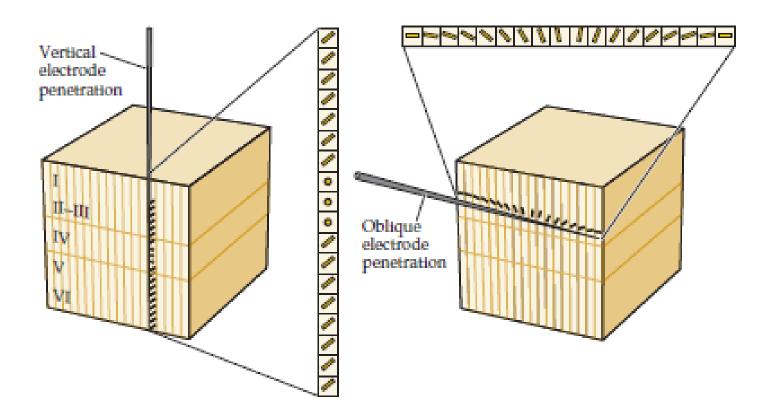
- Three possible coding schemes of of visual images
- 1) Single neurons- information coded in the magnitude of single neuron response to different images
- Pro: most simple and straightforward coding scheme
- Con: Unrealistic given large number of possible images, "grand-mother" neuron never found
- 2) Population vector- information coded by the activation patterns of neuronal groups
- Pro: solves the combinatorial explosion problem Con: Sensitive to large scale noise, adaptation and input disruptions
- 3) Relational coding- information is coded by the correlations between patternsPro: Robust to noise, intrinsic in nature, explains cortical specializationsCon: limited experimental support

Functional organization of the cortex

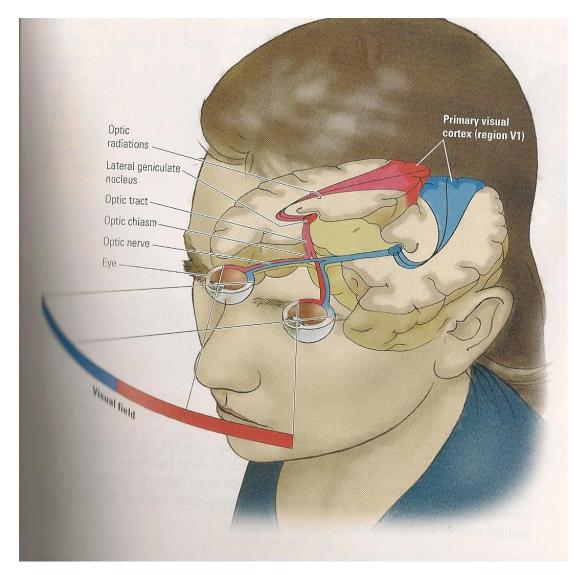
Vertical organization: 6 layers



Functional organization of Area V1 Horizontal organization: "Orientation columns"

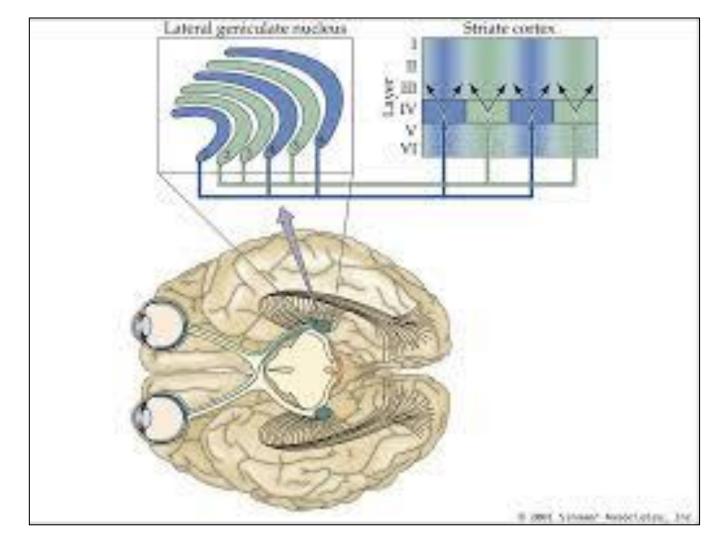


### How is the information from the two eyes combined?



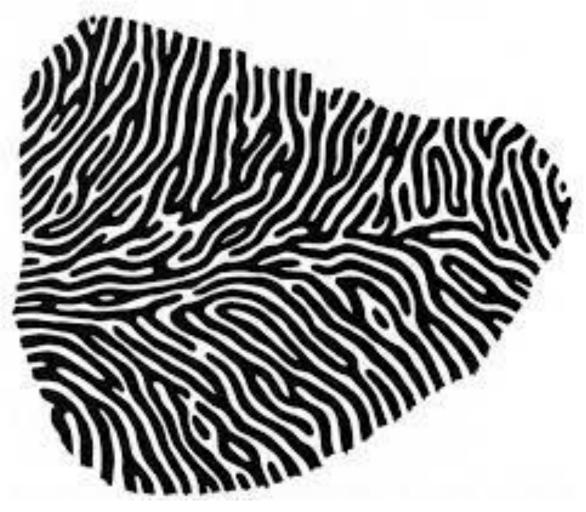
### Right and left eyes outputs converge in the LGN

### LGN: Ocular outputs are segregated in layers Cortex: Ocular outputs are segregated in columns



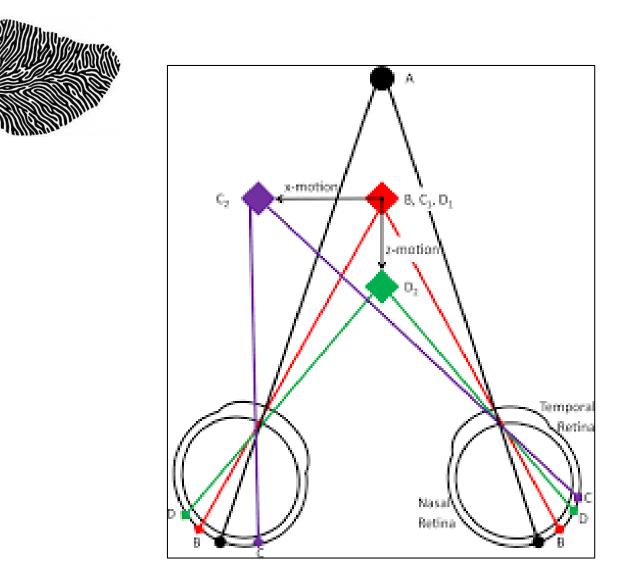
**Ocular Dominance Columns** 

### Monkey Ocular Dominance Columns- top view

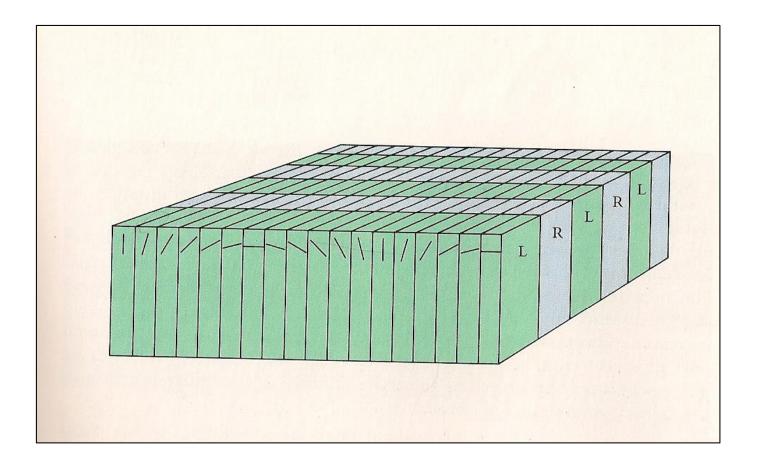


Area V1

### What is the function of the ocular selectivity?

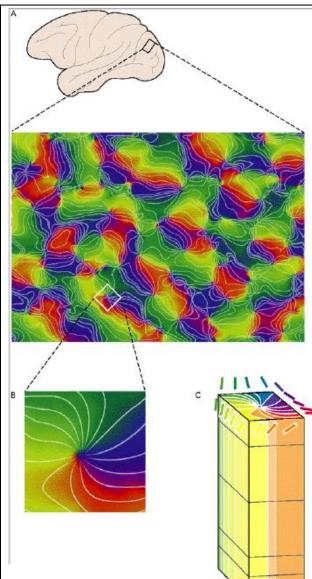


### How are the ocular dominance and orientation columns combined?

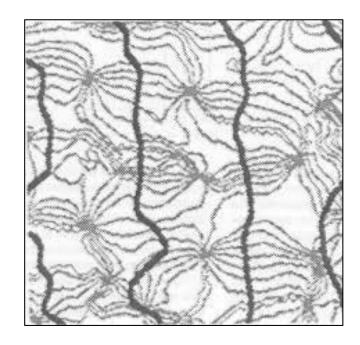


The idealized "hyper-column" model

# How are the ocular dominance and orientation columns combined? Orientation map of V1



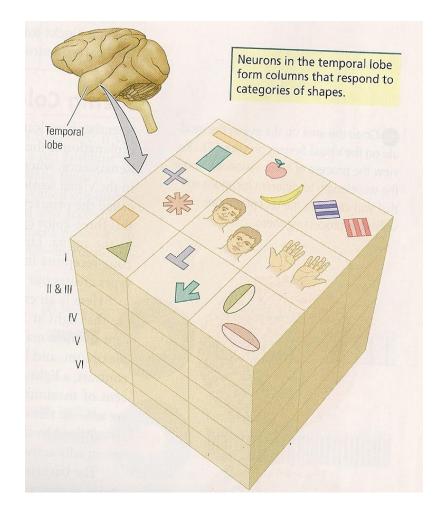
### **Orientation vs. Ocular Dominance**



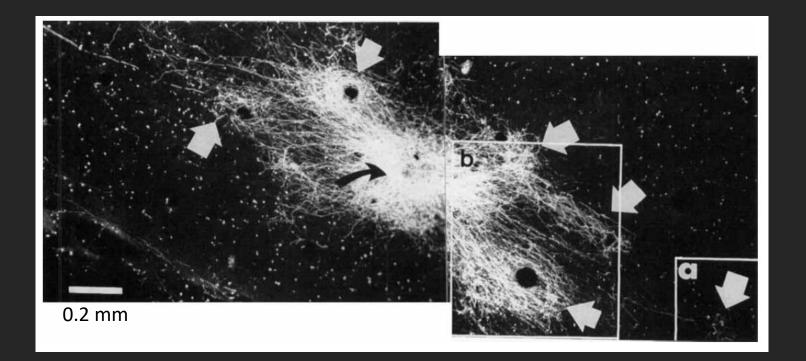
### Orientation (thin lines) Ocular-Dominance (thick lines)

The hyper-column as revealed by optical imaging

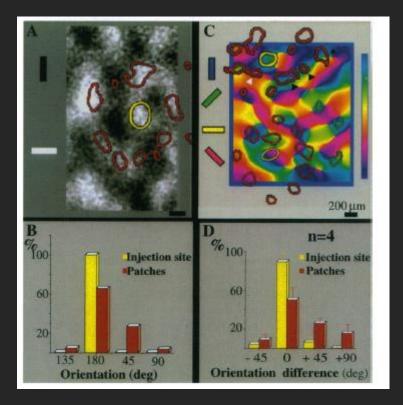
### Columnar organization of complex templates in high order Ventral Stream

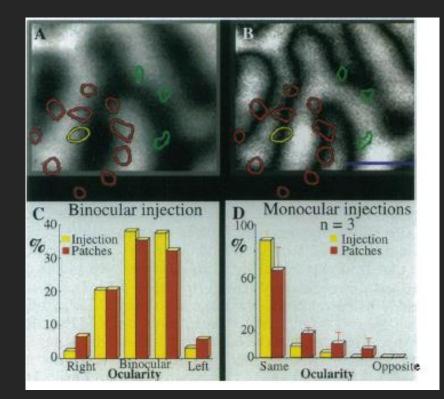


# Lateral Connectivity: massive, local, reciprocal interactions



# Lateral Connectivity connects similar-function columns

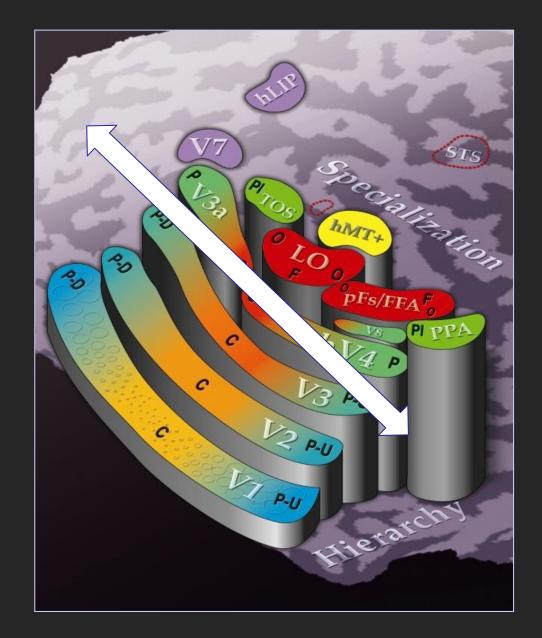




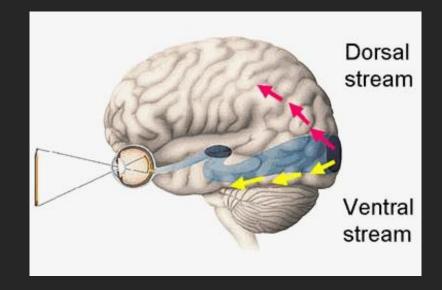
### **Interim Summary**

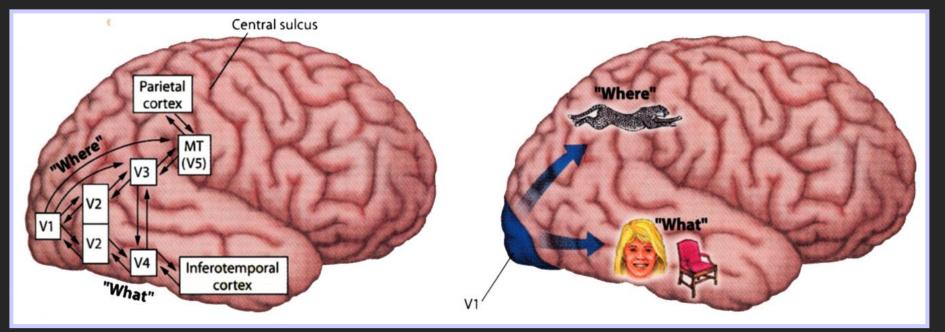
- The functional organization of local cortical sites
- Along the vertical dimension:
- Similar functional selectivities (orientation, ocular dominance) Six different layers- inputs arrive in middle layers, output leave of outer layers
- Along the horizontal dimension Local transition in orientation and ocular dominance Global transition along retinotopic positions
- Same organization in higher areas but for complex shapes
- Inter-columnar communication through massive lateral connections

# Large scale specialization in the visual system

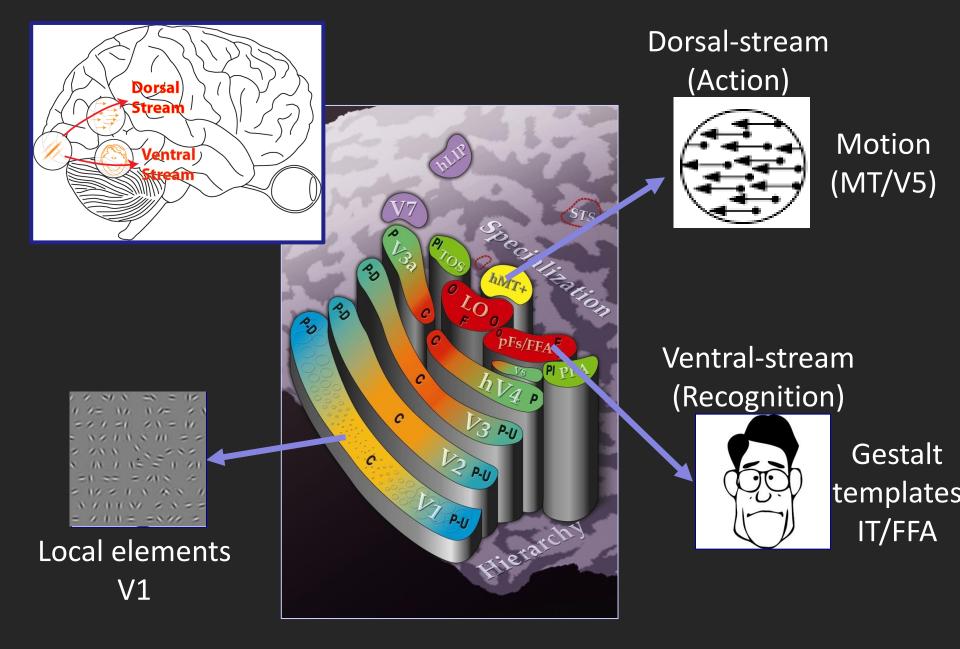


### <u>Two streams in the visual system</u>

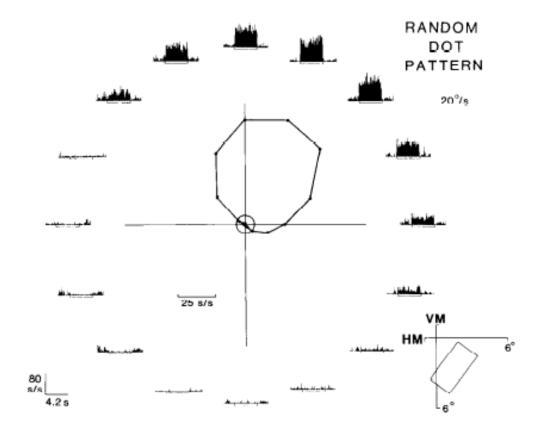




#### Content-Selectivity in human visual cortex

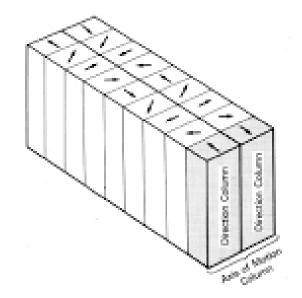


#### Direction selectivity in area MT- Dorsal stream

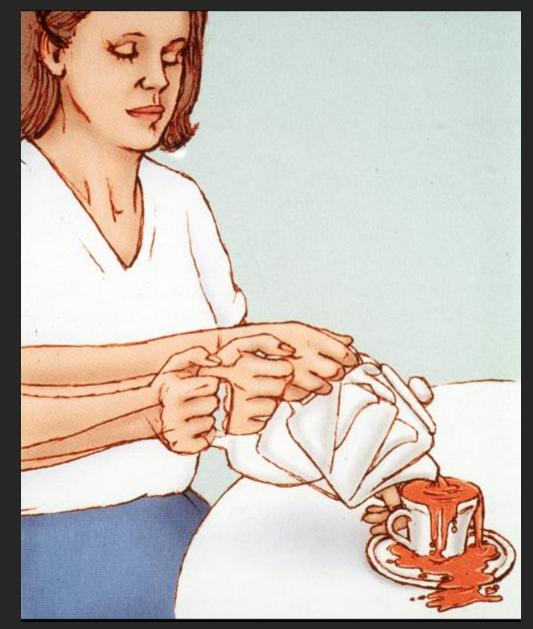


# Columnar organization for direction and orientation in area MT

Columnar architecture in MT



# Motion blindness following dorsal stream lesion



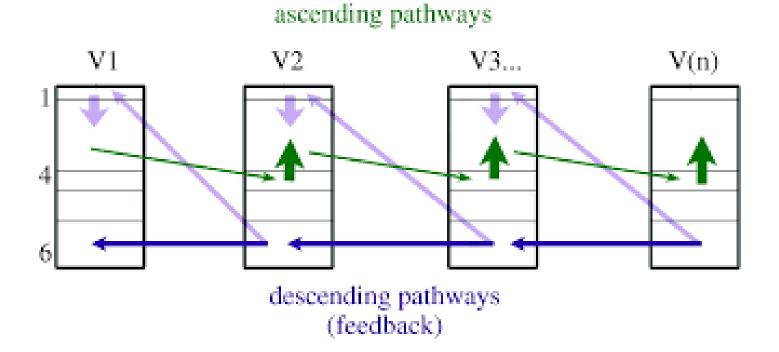
#### **Interim Summary**

• On a large scale we find a specialization of the visual system into two streams

The ventral stream specializes in form perception and recognition Contains neurons sensitive to static templates of objects insensitive to location

The dorsal stream specializes in motion and action Contains neurons sensitive to motion direction and speed

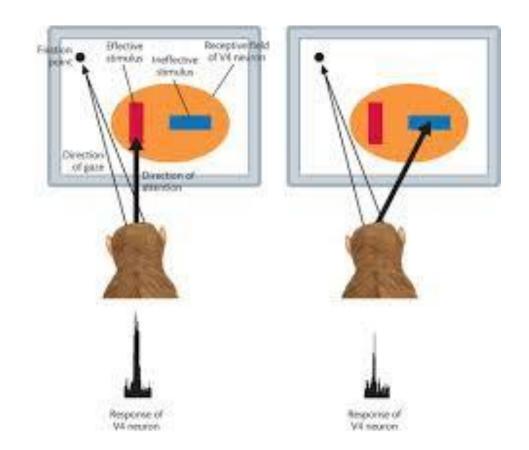
# Massive "Top-Down" connections along the visual hierarchy





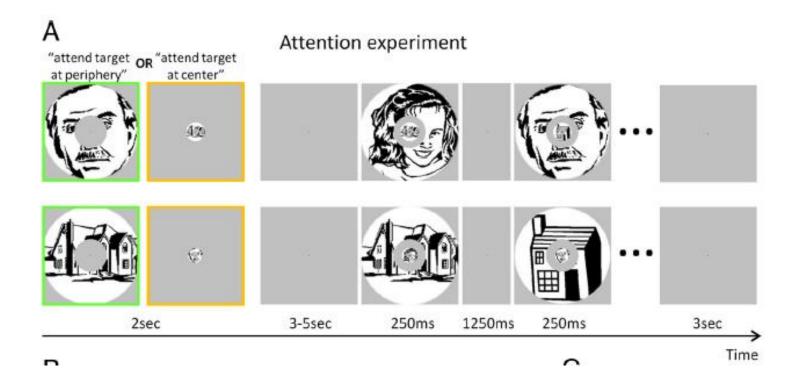
# Illustrating the role of attention in visual model creation

#### Attention mediated by top-down connections

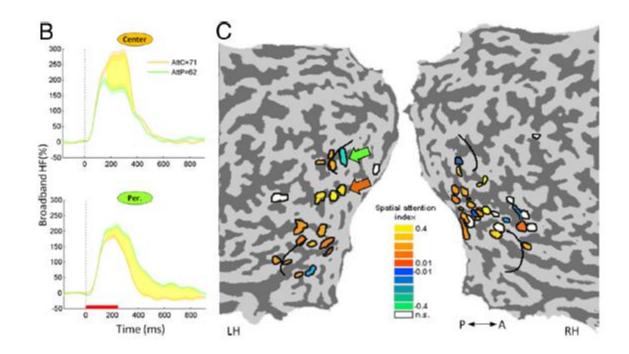


Moran and Desimone

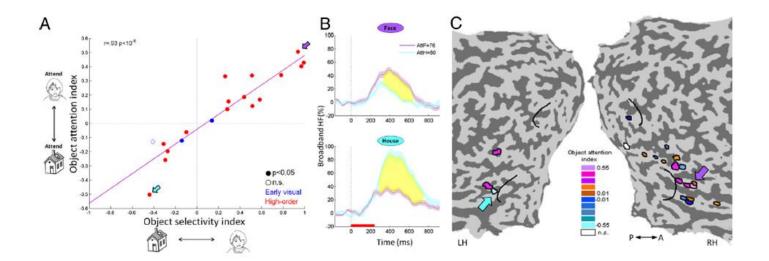
# Top down attention in the human visual system



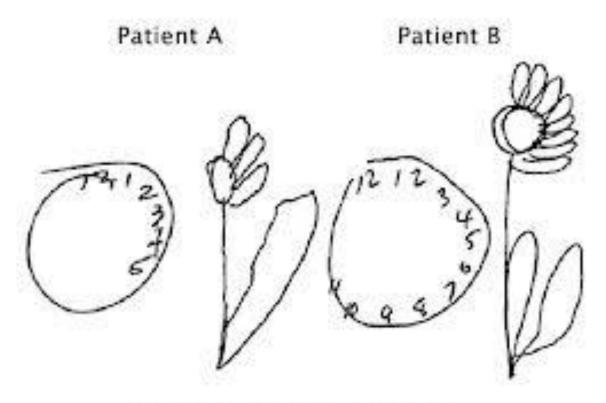
# Spatial ("spot-light") attention in early visual system



# Template --selective attention in high order, ventral stream



#### Spatial attention is mediated via the right dorsal stream



Copies of a clock and a daisy

Visual Neglect following right parietal lobe lesion

# Summary

- Parallel to the feed-forward hierarchical flow there is a massive top-down information flow
- The top-down flow implements attentional selection: Spatial attention:
- Enhances activity in attended retinotopic locations
- Feature- based/form attention
- Enhances activity in attended feature/form representations
- Damage to the top-down mechanism results in visual neglect