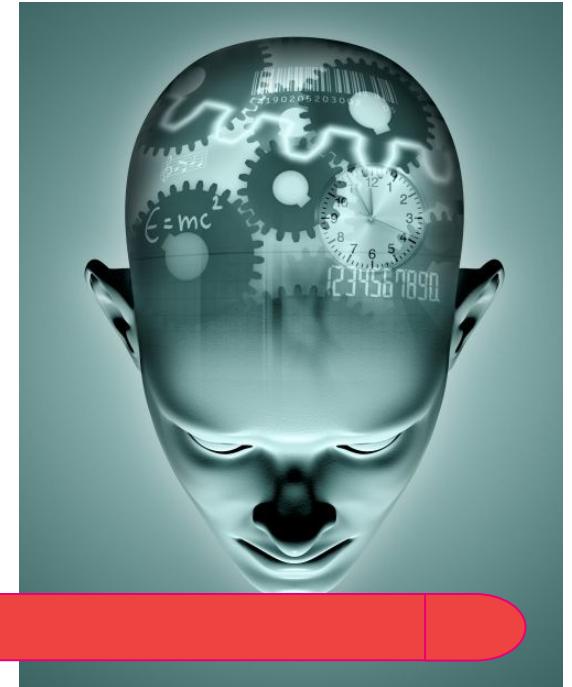


# Neuroeconomics :

## Neuroscience of decision making

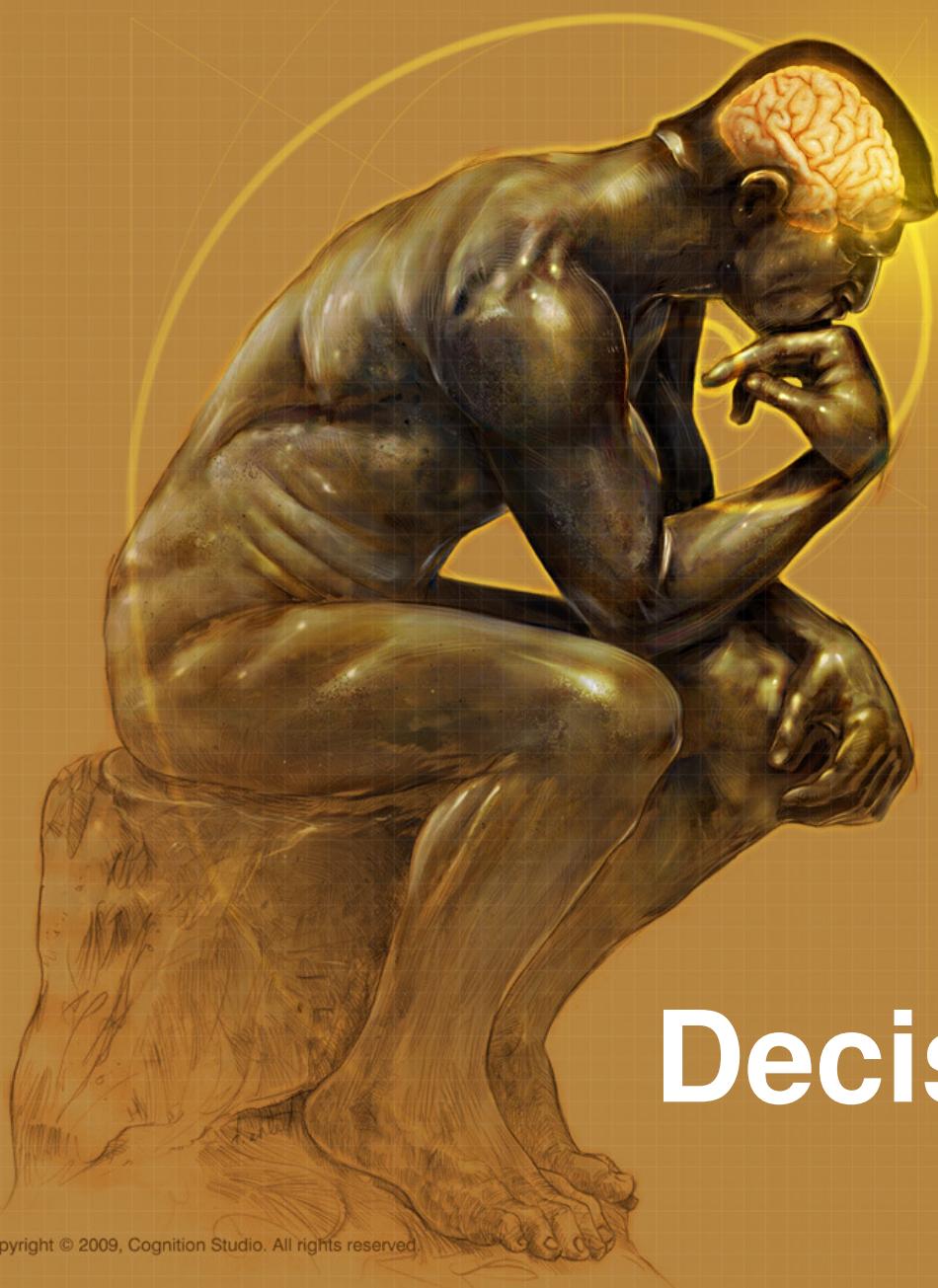
Lecture N2



## Brain Anatomy and Functions...

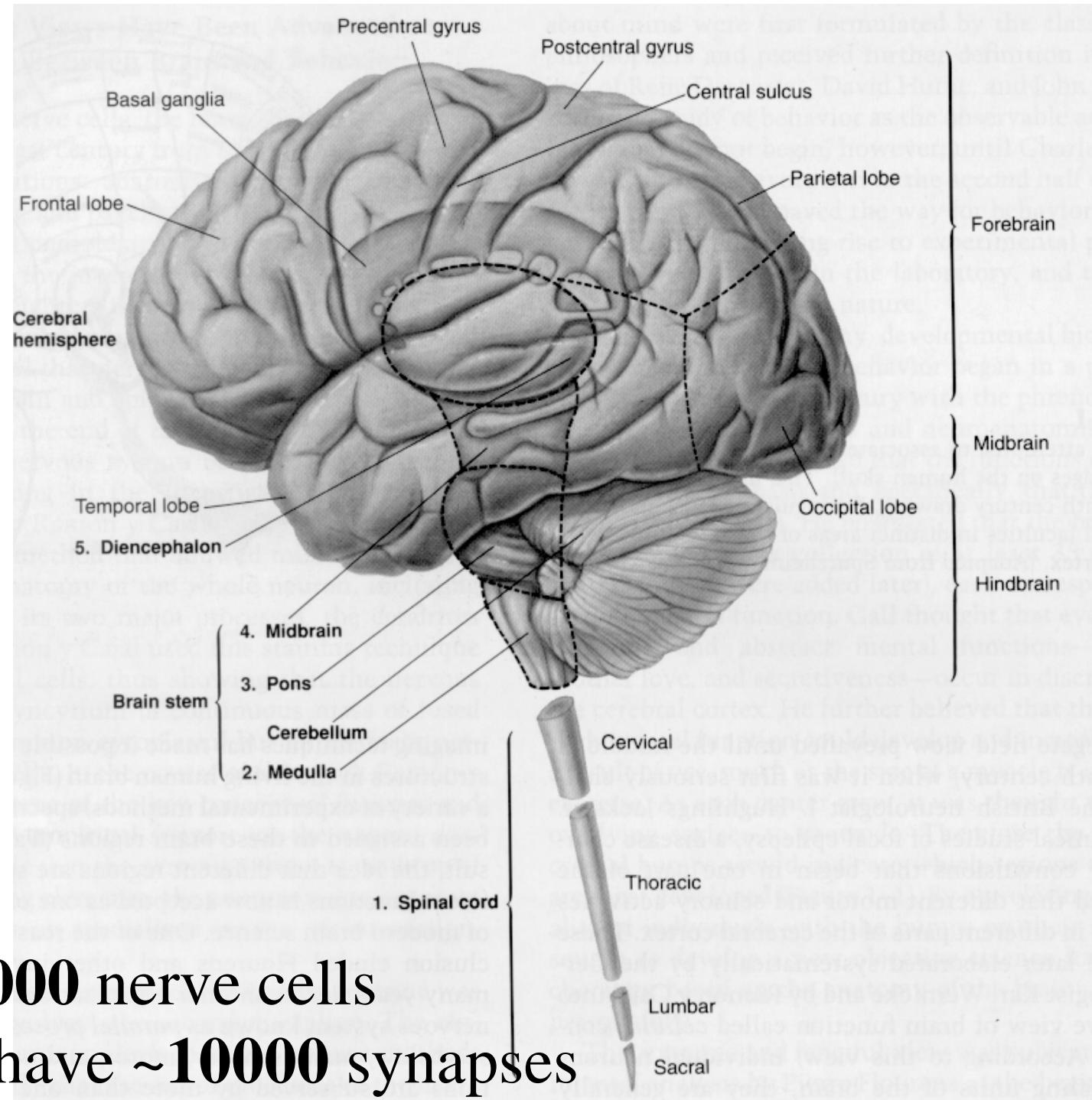
**Vasily Klucharev**

- Higher School of Economics

A bronze statue of Rodin's 'The Thinker' is shown from the waist up, sitting in a contemplative pose with his chin resting on his hand. A bright, glowing yellow light emanates from his brain, casting a soft glow on the surrounding area. The background is a warm, golden-yellow color with faint grid lines, suggesting a chalkboard or sketchpad.

# Decision making

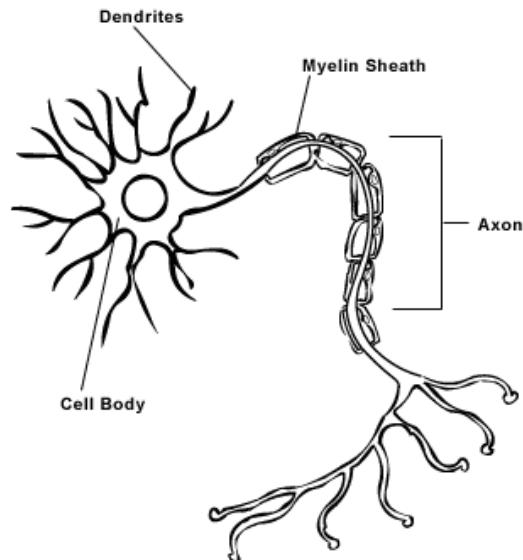
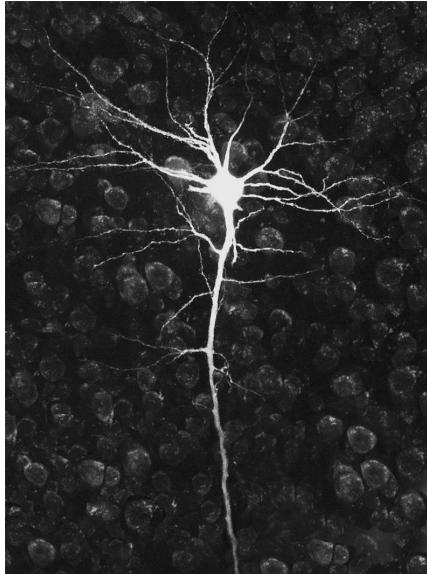
Copyright © 2009, Cognition Studio. All rights reserved.



**100,000,000,000** nerve cells  
Typical cells have ~10000 synapses

# Cellular components of the nervous system

**Neurons:** Fundamental units of the brain, spinal cord and peripheral nerves



## Dendrite

- Target for synaptic input from other neurons

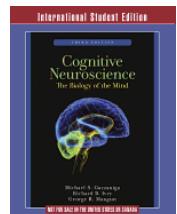
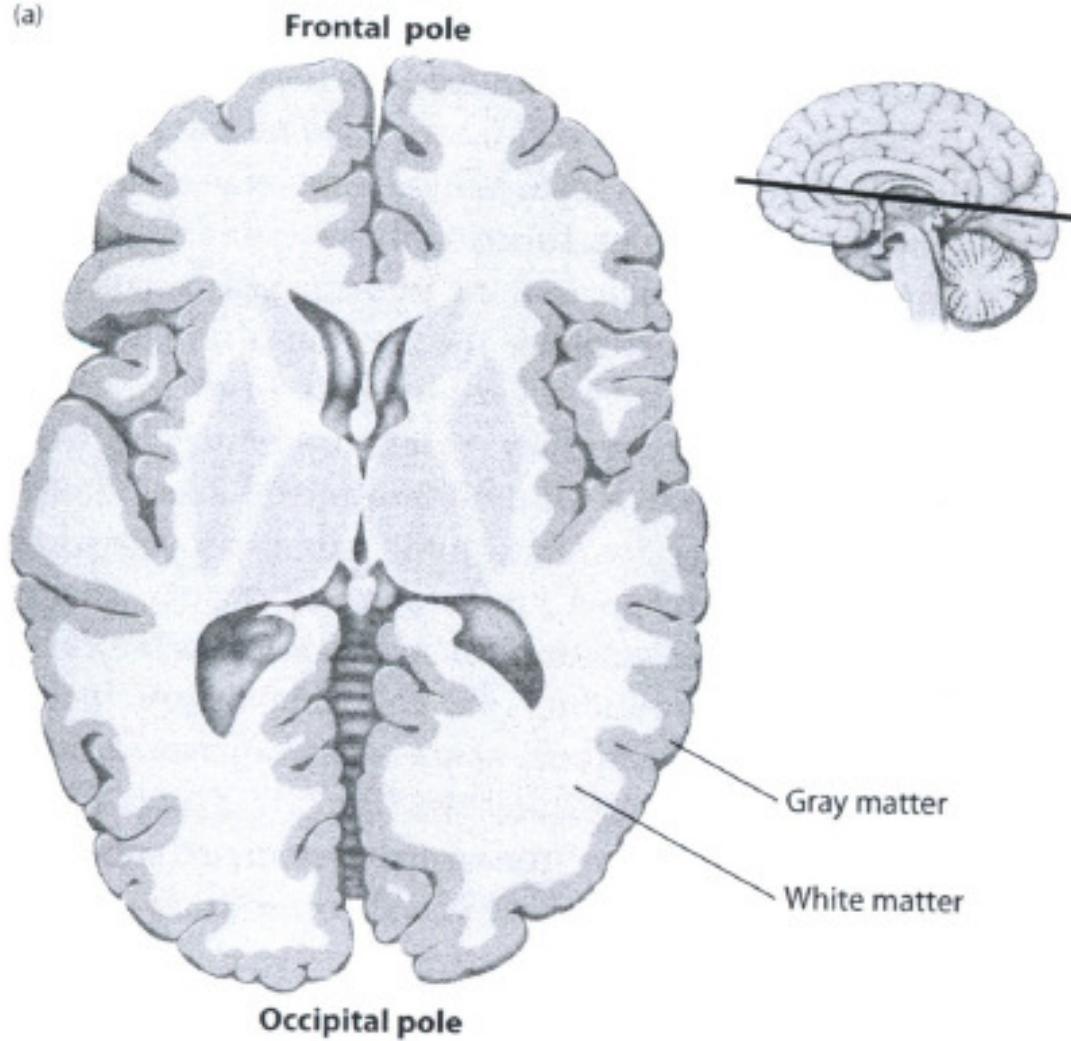
## Axon:

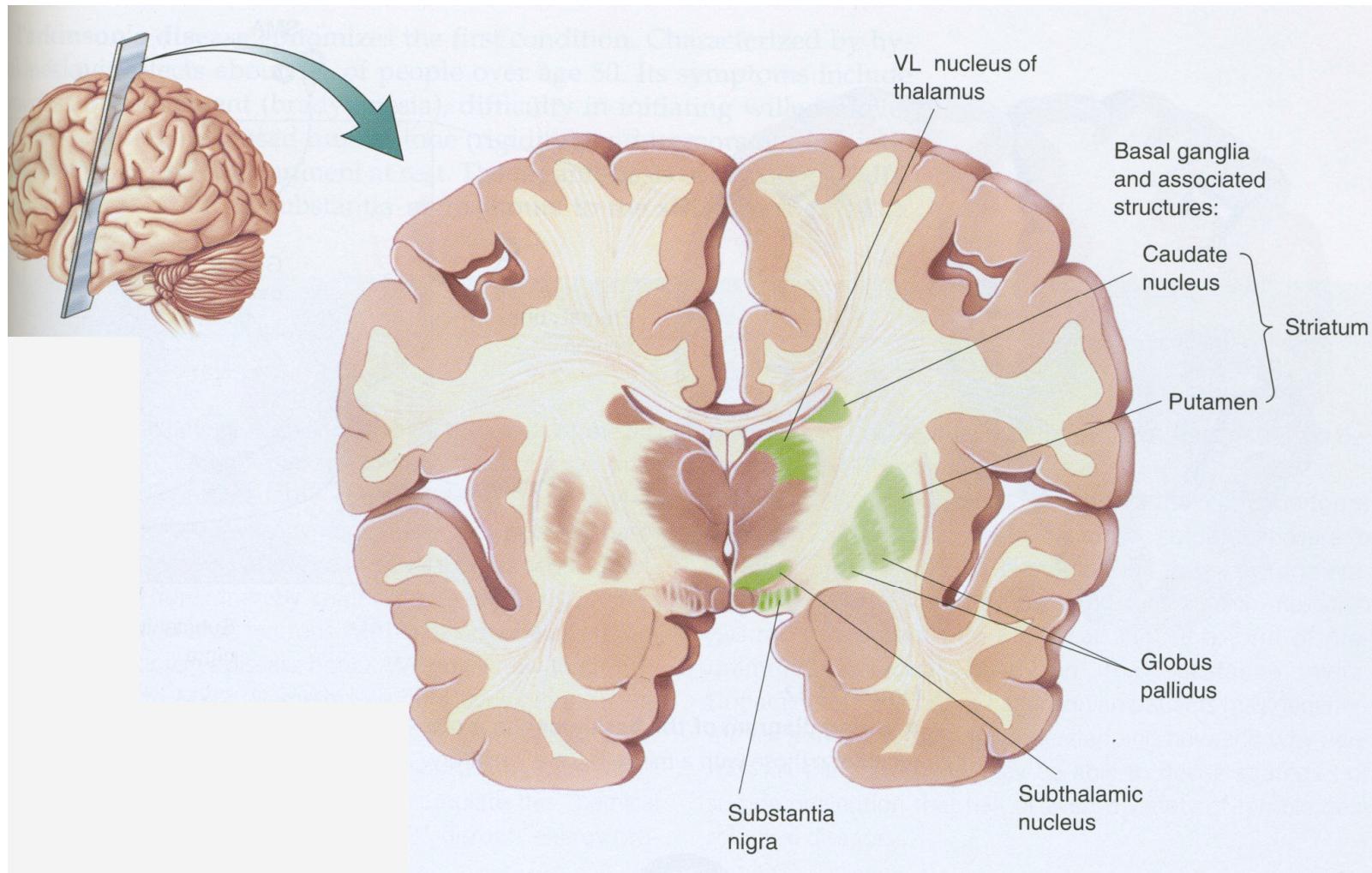
- Transmission of electrical signal from cell body to other neuron

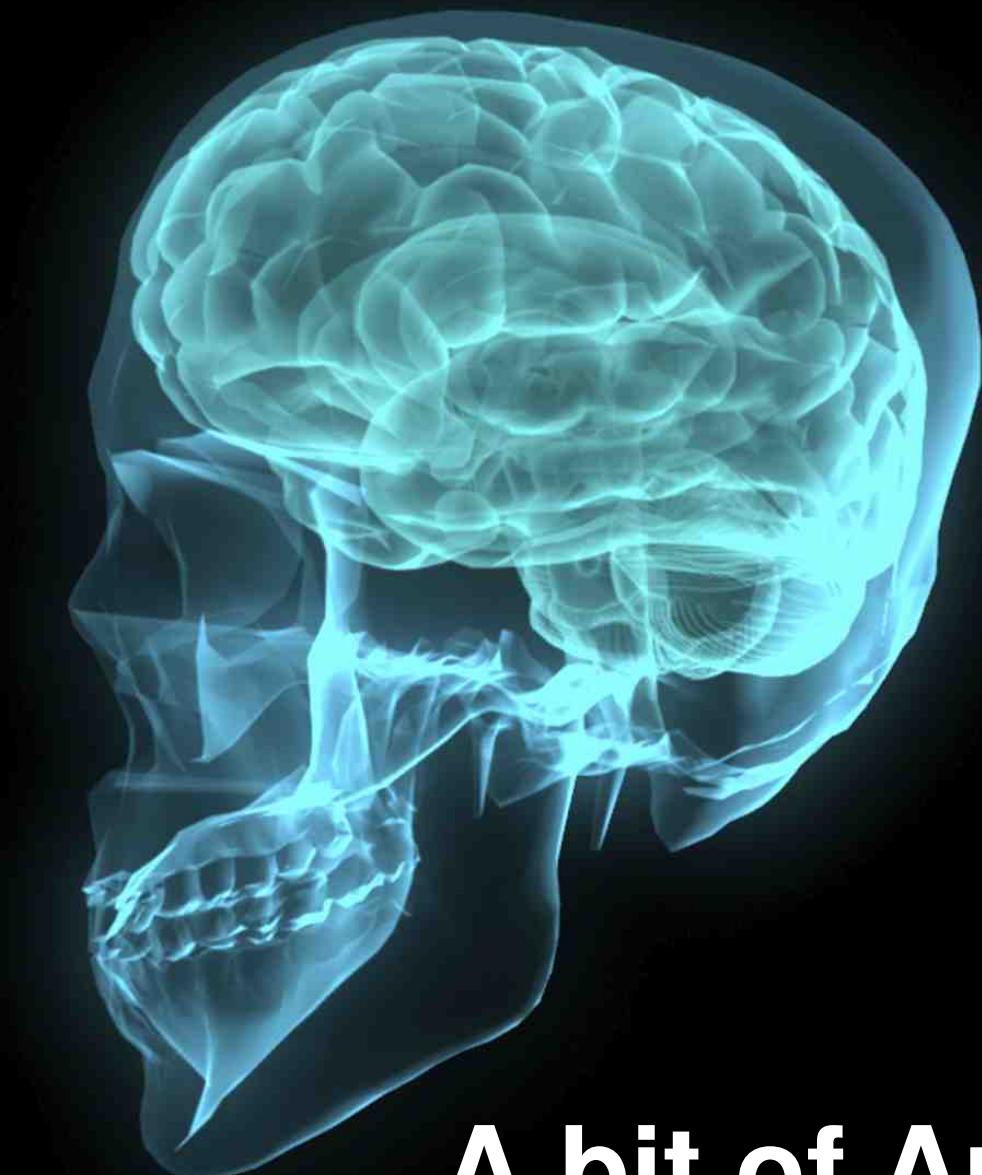
## Myelin:

- Substance that insulates axon

(a)







A bit of Anatomy

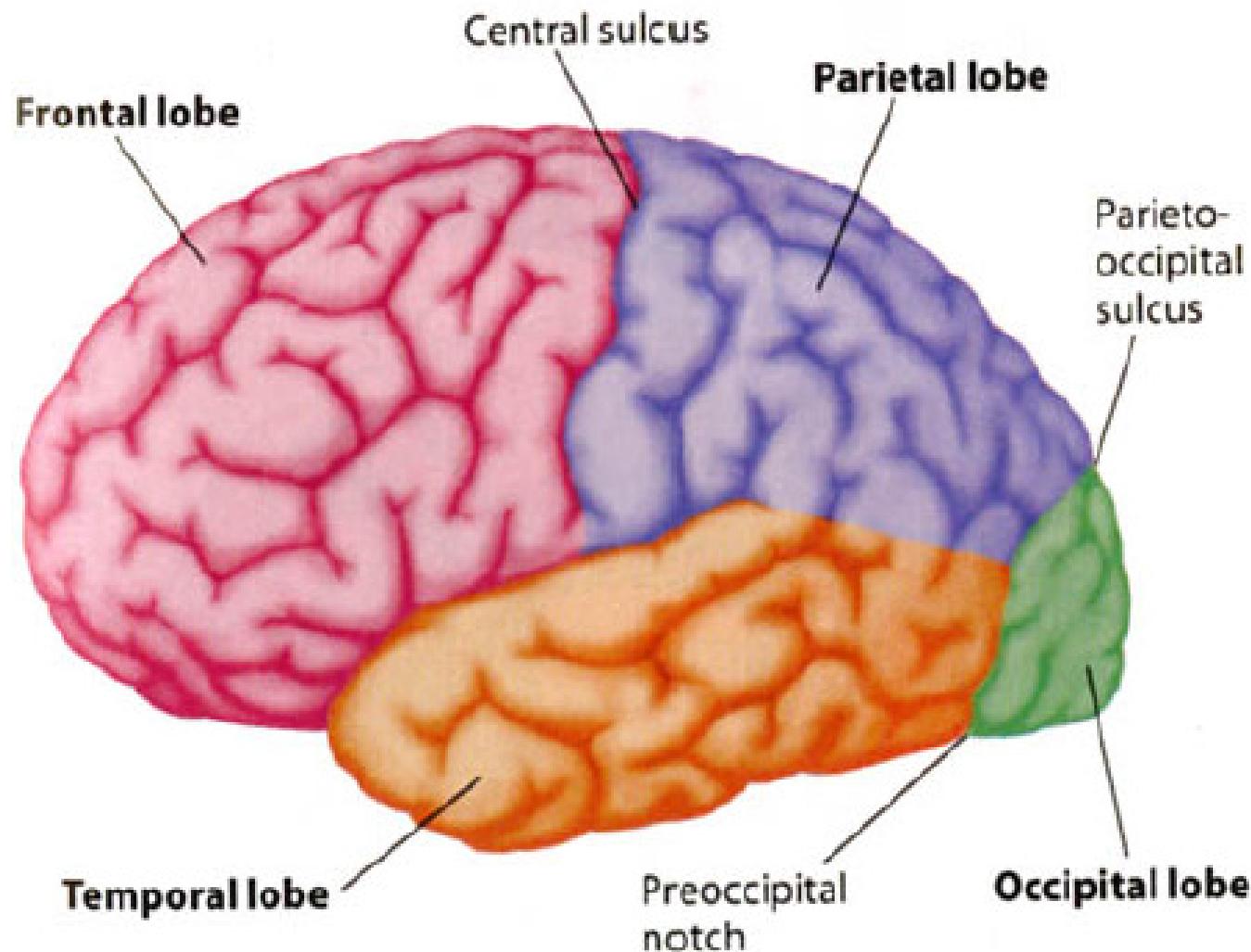
THIRD EDITION

# Cognitive Neuroscience

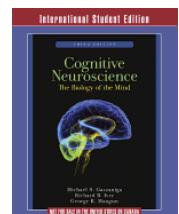
The Biology of the Mind



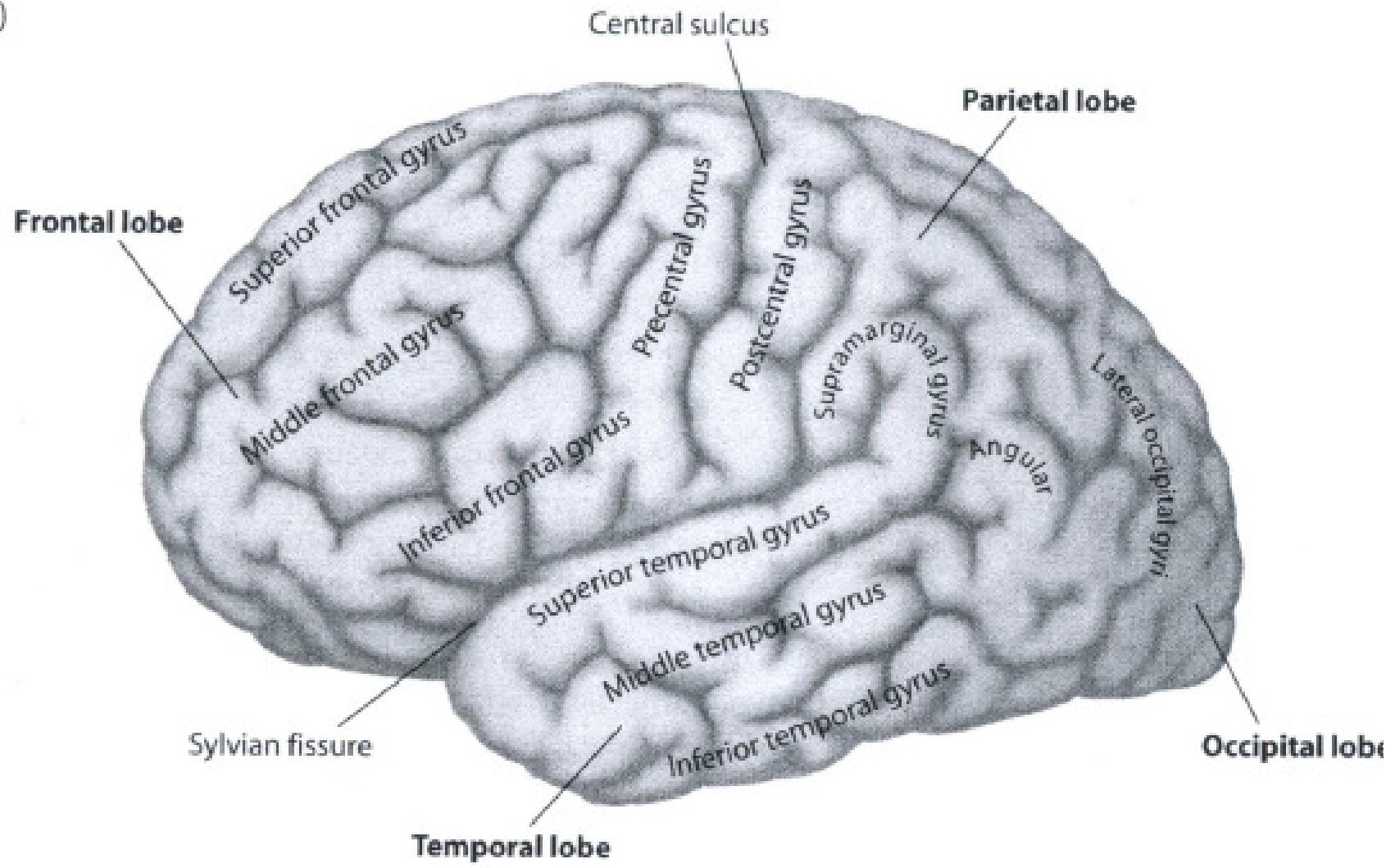
Michael S. Gazzaniga  
Richard B. Ivry  
George R. Mangun

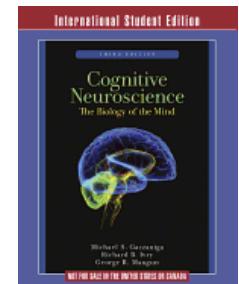
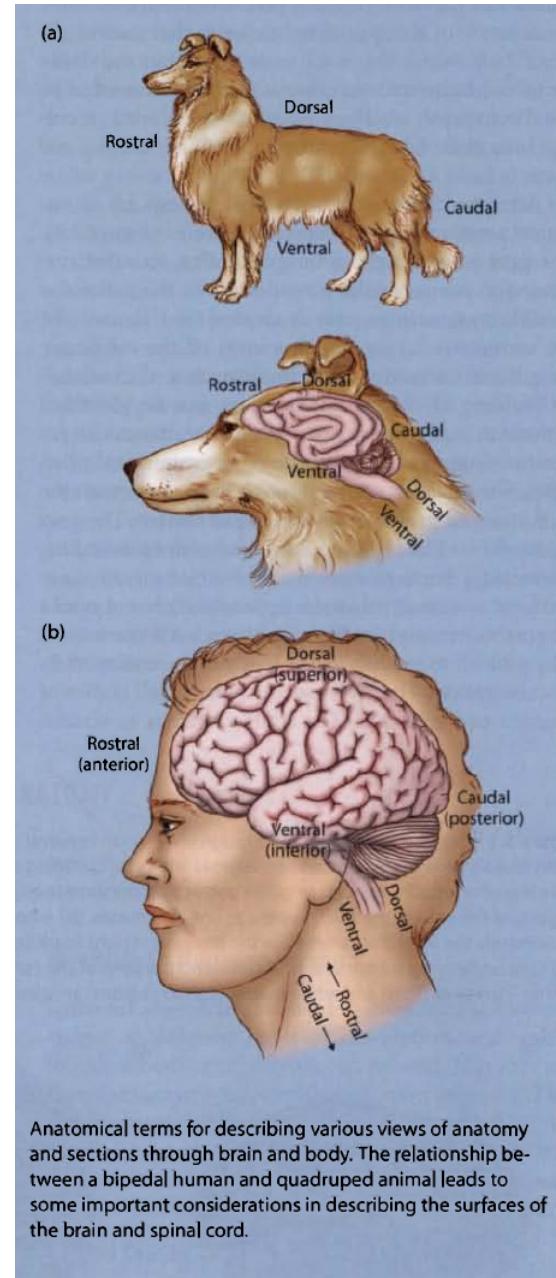
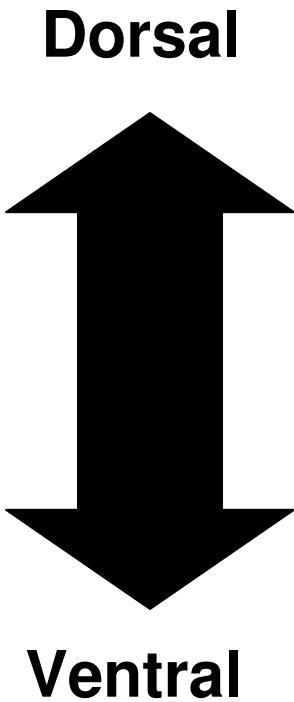


**Figure 3.10** Four lobes of the cerebral cortex, in lateral view of the left hemisphere. See text for details.

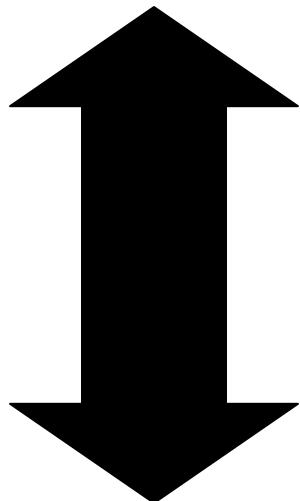


(a)

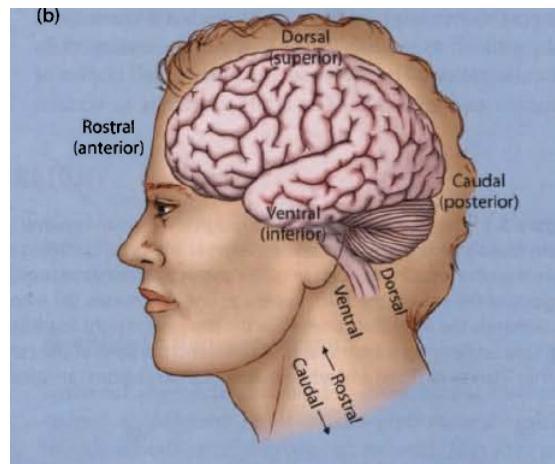




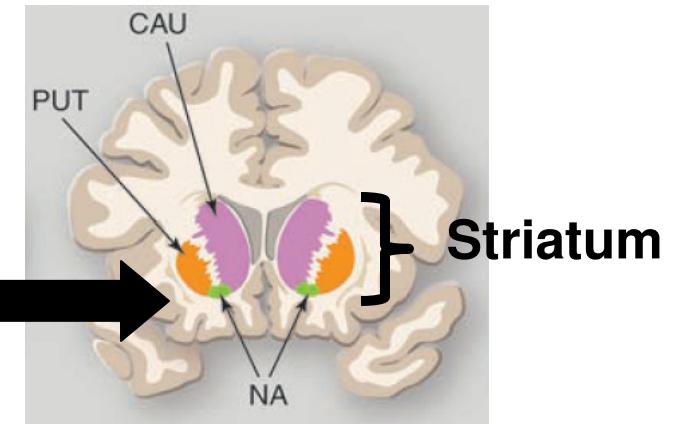
Dorsal

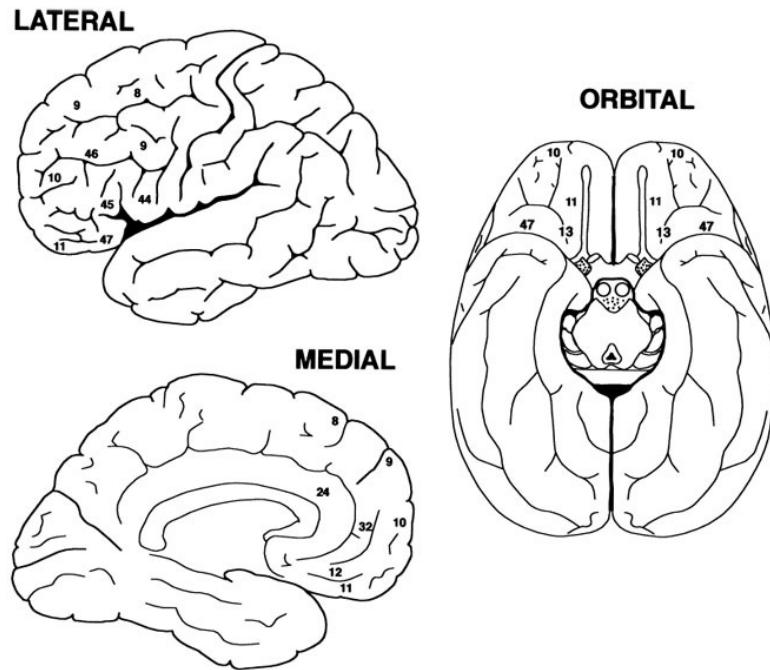
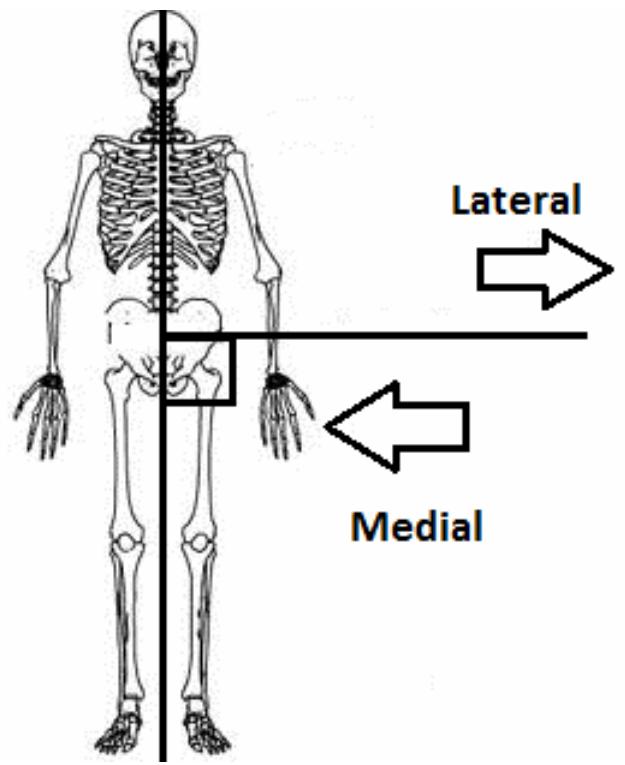


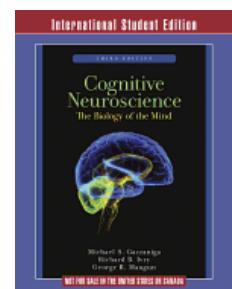
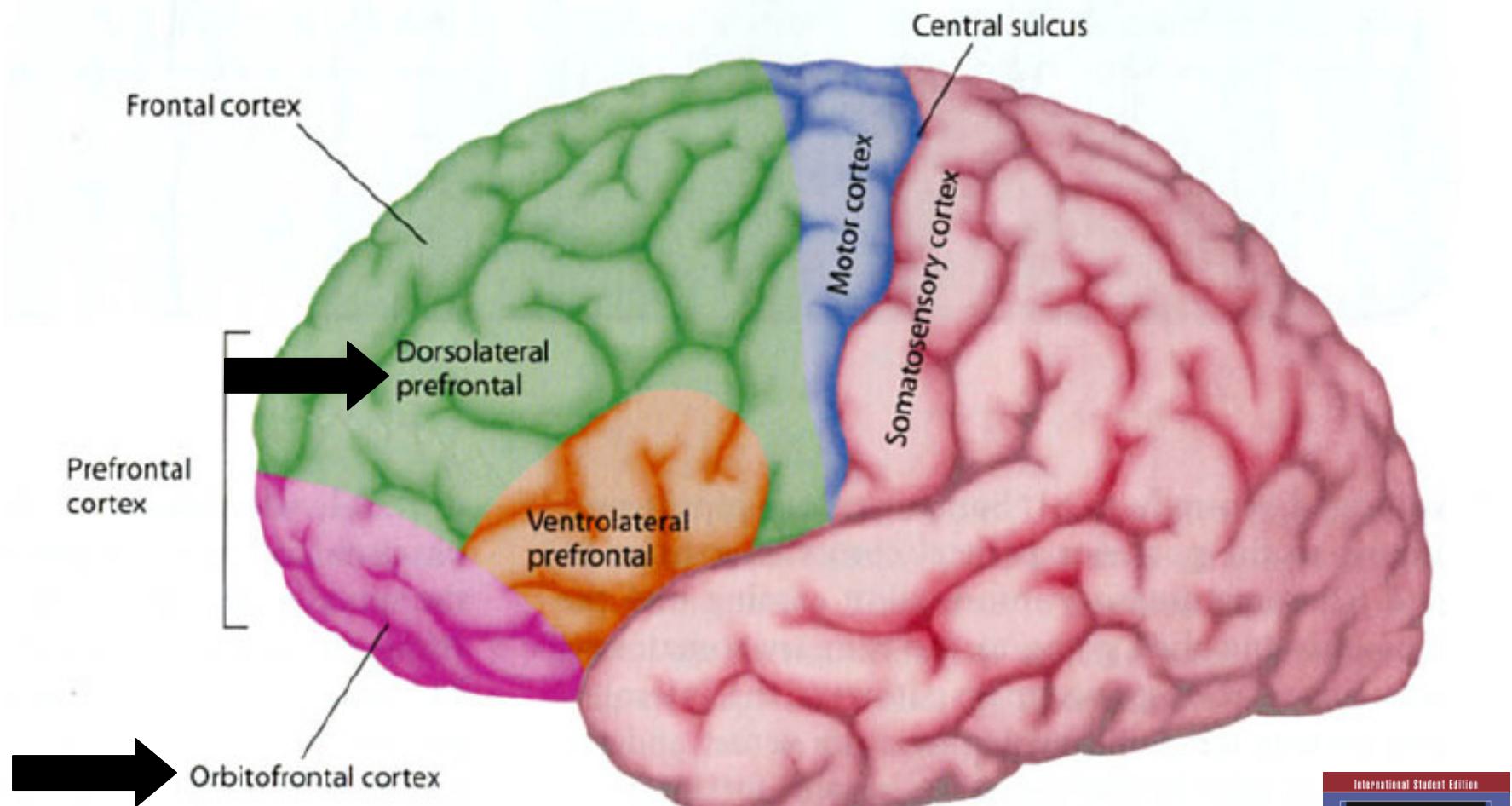
Ventral

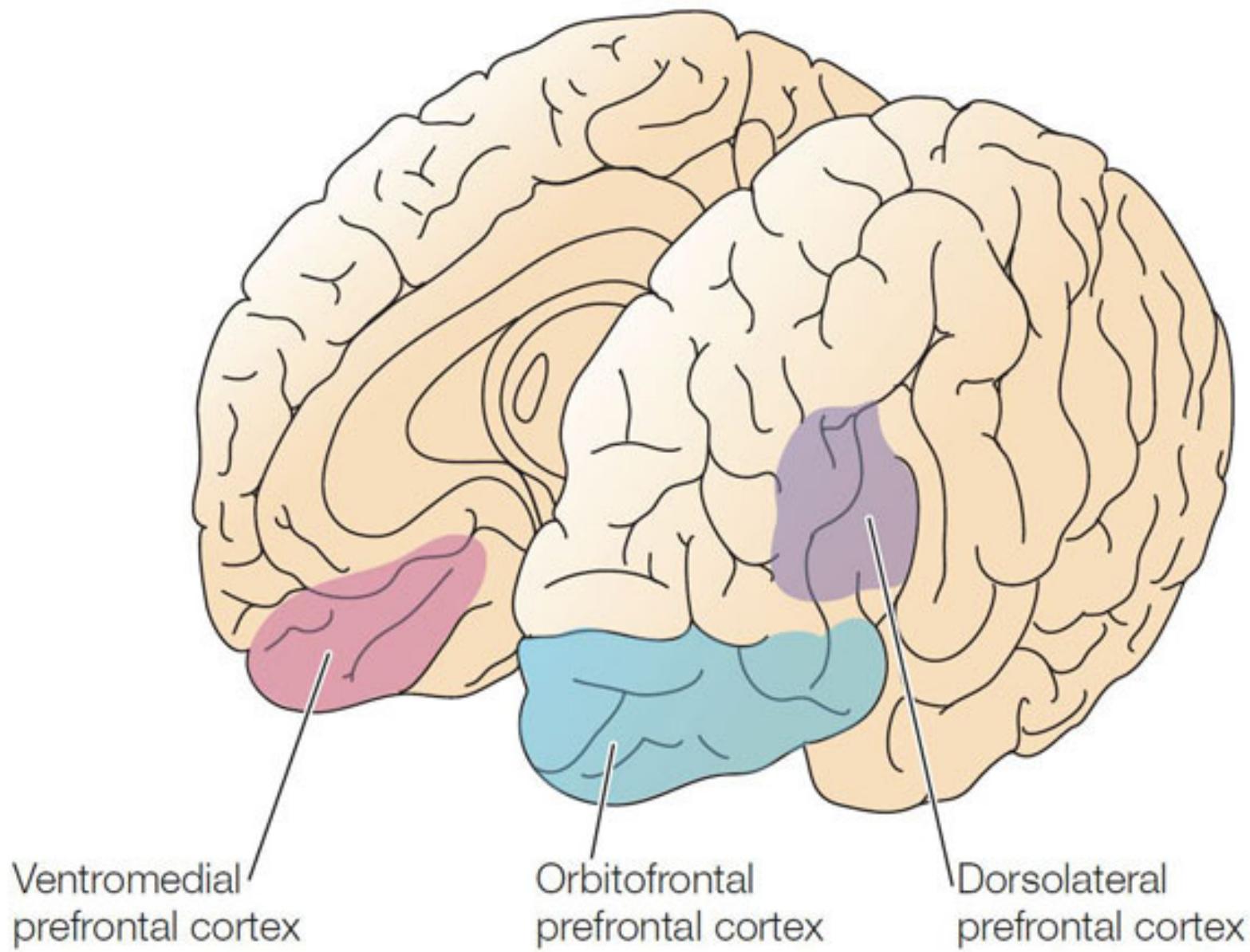


Ventral striatum  
(NA)

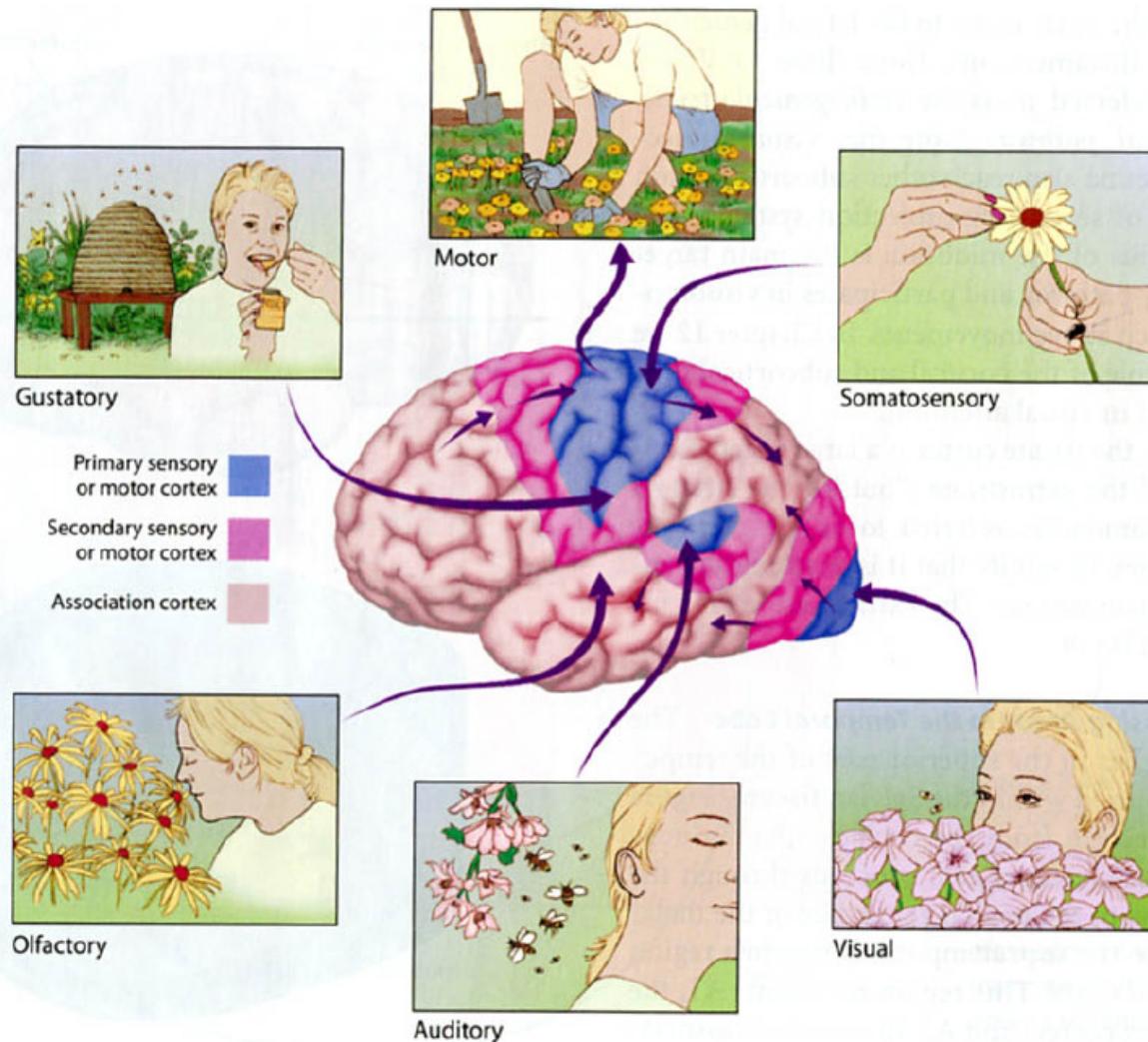




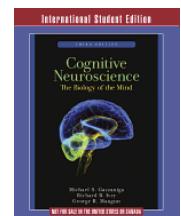


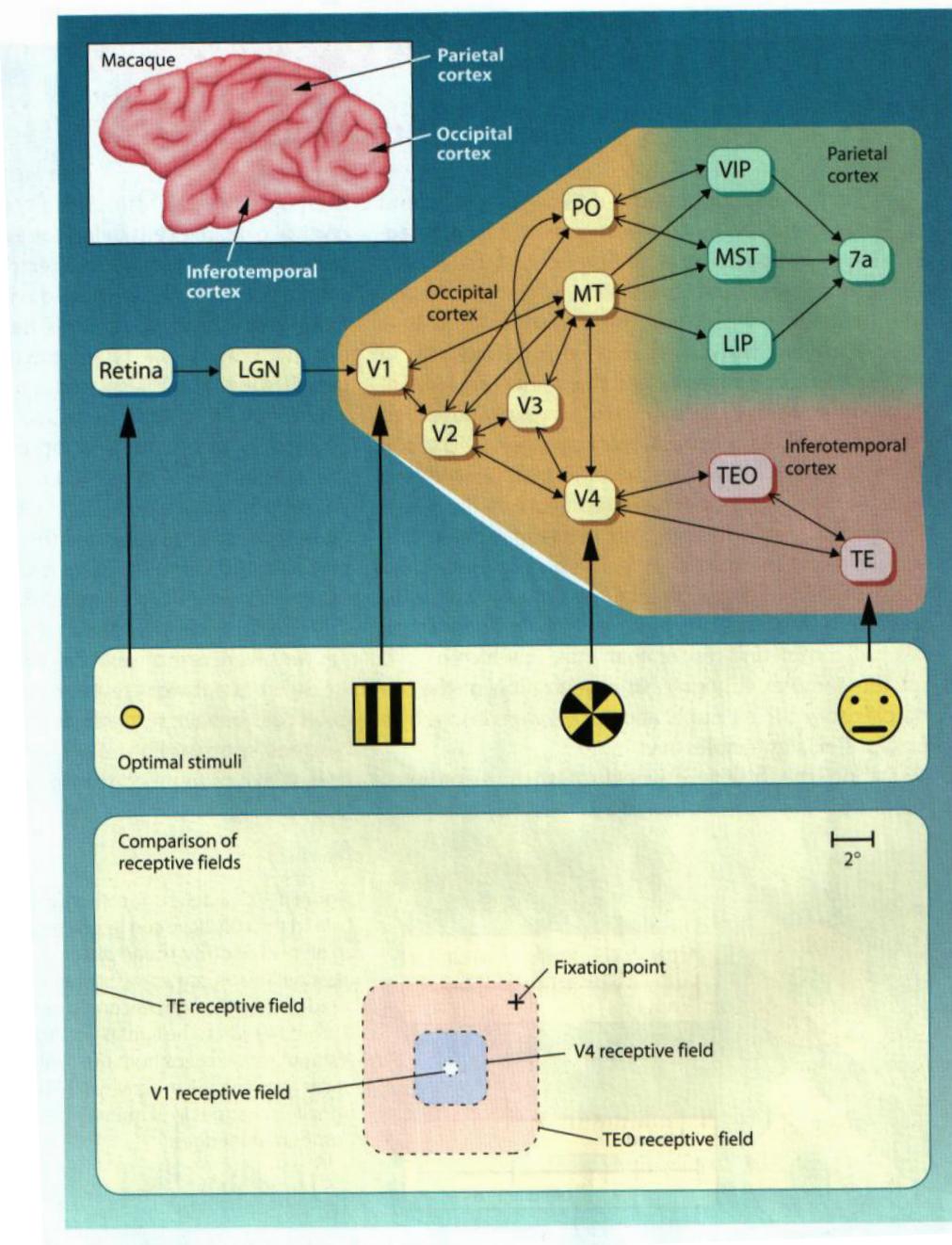


# Processing of sensory information



**Figure 3.17** Primary sensory and motor cortex and surrounding association cortex. The blue regions show the primary cortical receiving areas of the ascending sensory pathways and the primary output region to the spinal cord. The secondary sensory and motor areas are colored red. The remainder is considered association cortex.







?

**Sensory processing**  
(sensory evidences)



**Decision making**

# Methods

1. Lesions
2. Electrical stimulation of the brain
3. Transcranial Magnetic Stimulation – TMS
4. Electrophysiology (cell recordings)
5. EEG, MEG
6. Functional Magnetic Resonance Imaging  
– fMRI

**Spatial resolution**



**Temporal resolution**

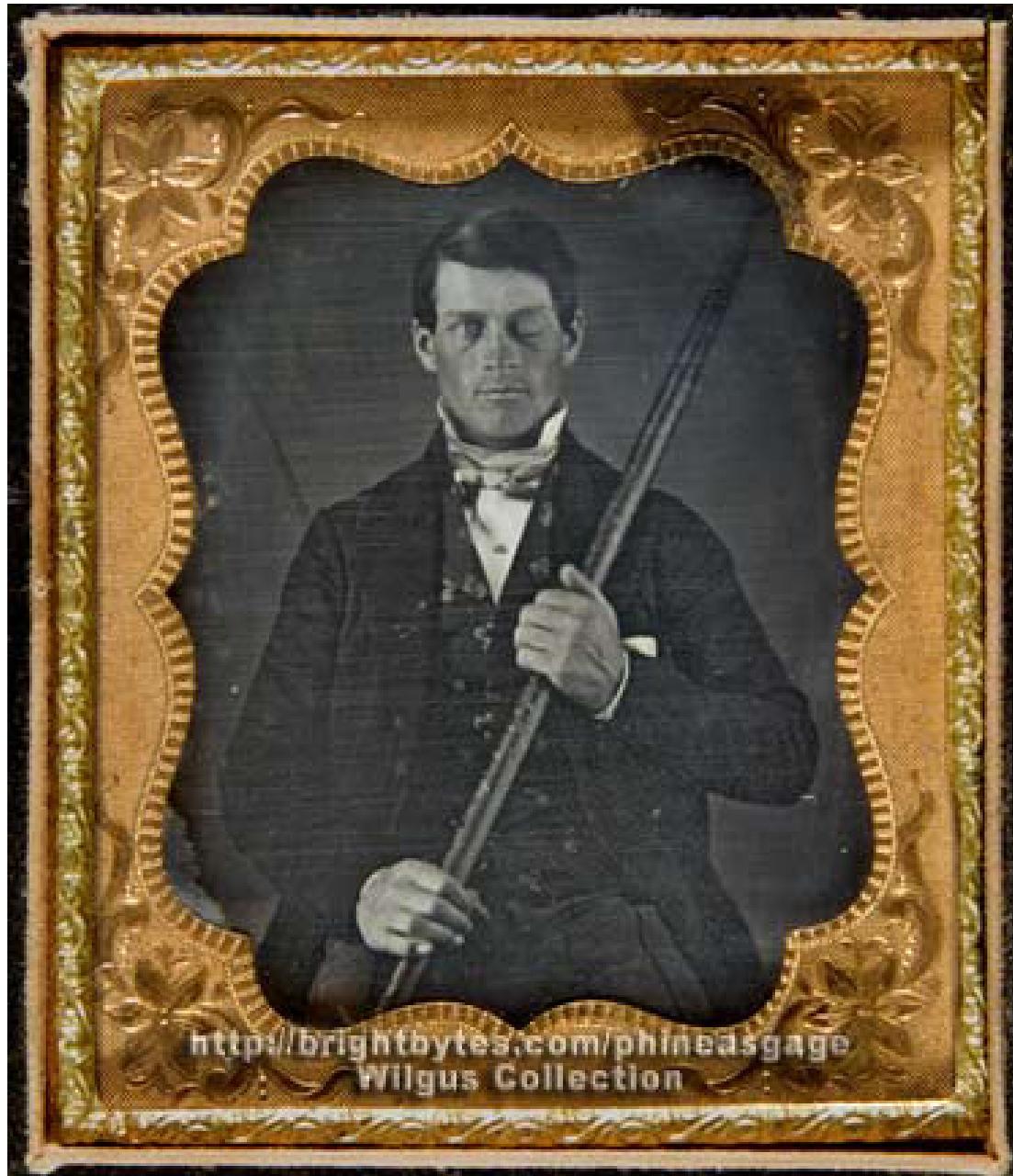


**Harold Edgerton**

# I. Lesions

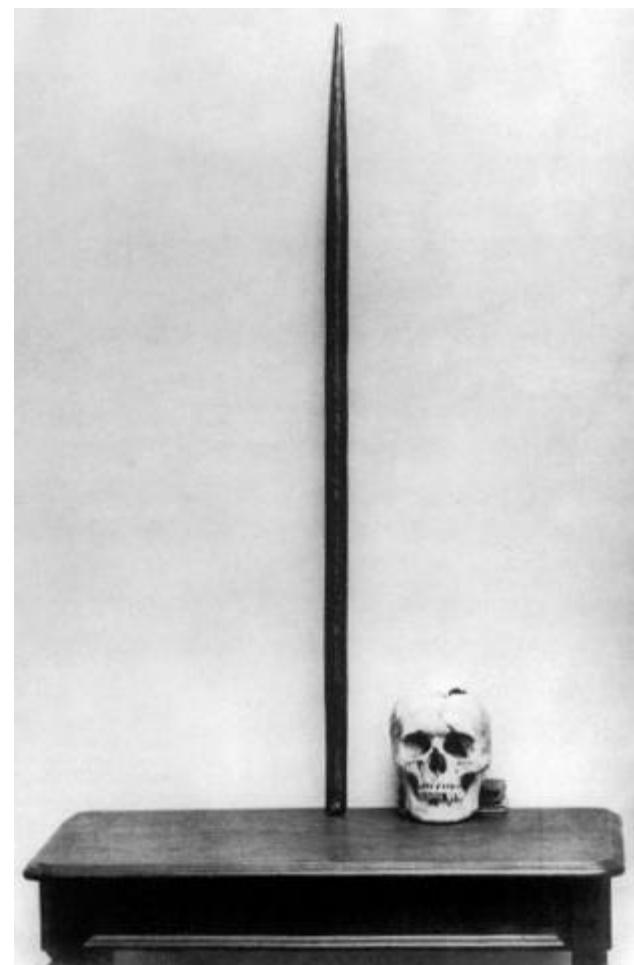
A **lesion** – any abnormal tissue damaged by disease or trauma (from the Latin word *laesio* – injury).

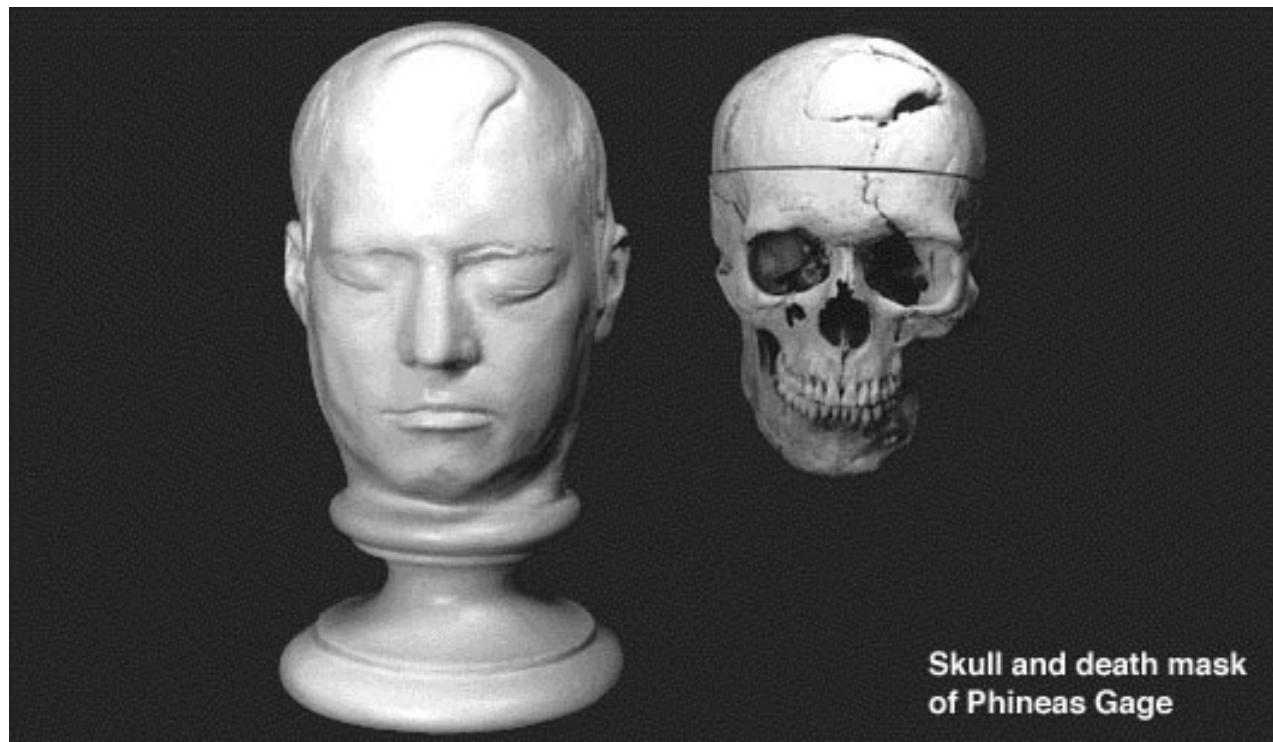
**Neuropsychology** – discipline that studies lesion in humans and animals, i.e. the structure and function of the brain related to specific psychological processes and overt behaviors.



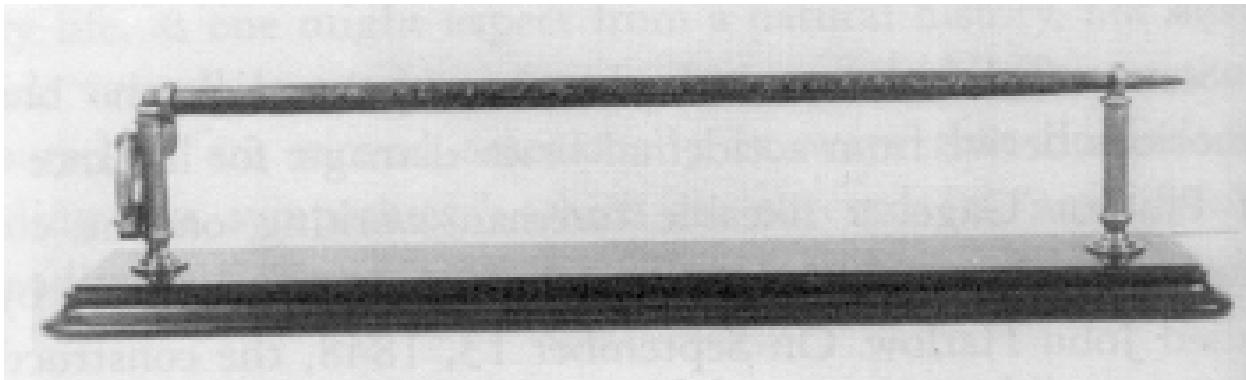
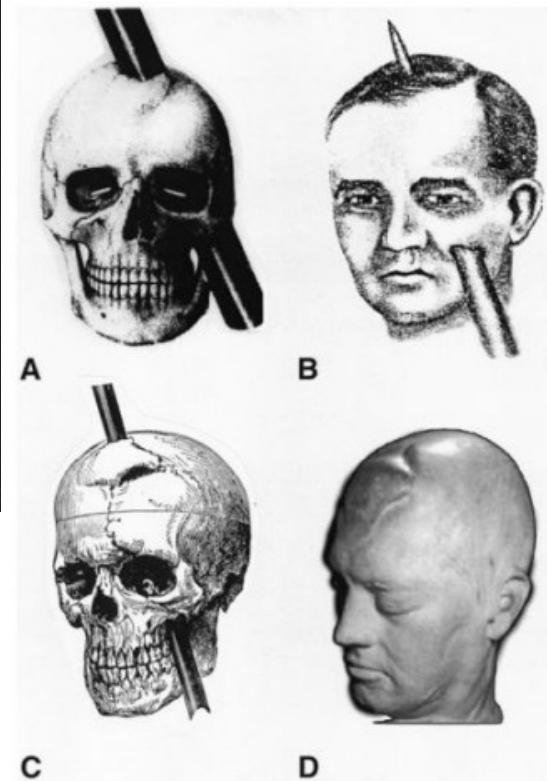
<http://brightbytes.com/phineasgage>  
Wilgus Collection

**Phineas P. Gage**  
**(July 9?, 1823 – May 21, 1860)**



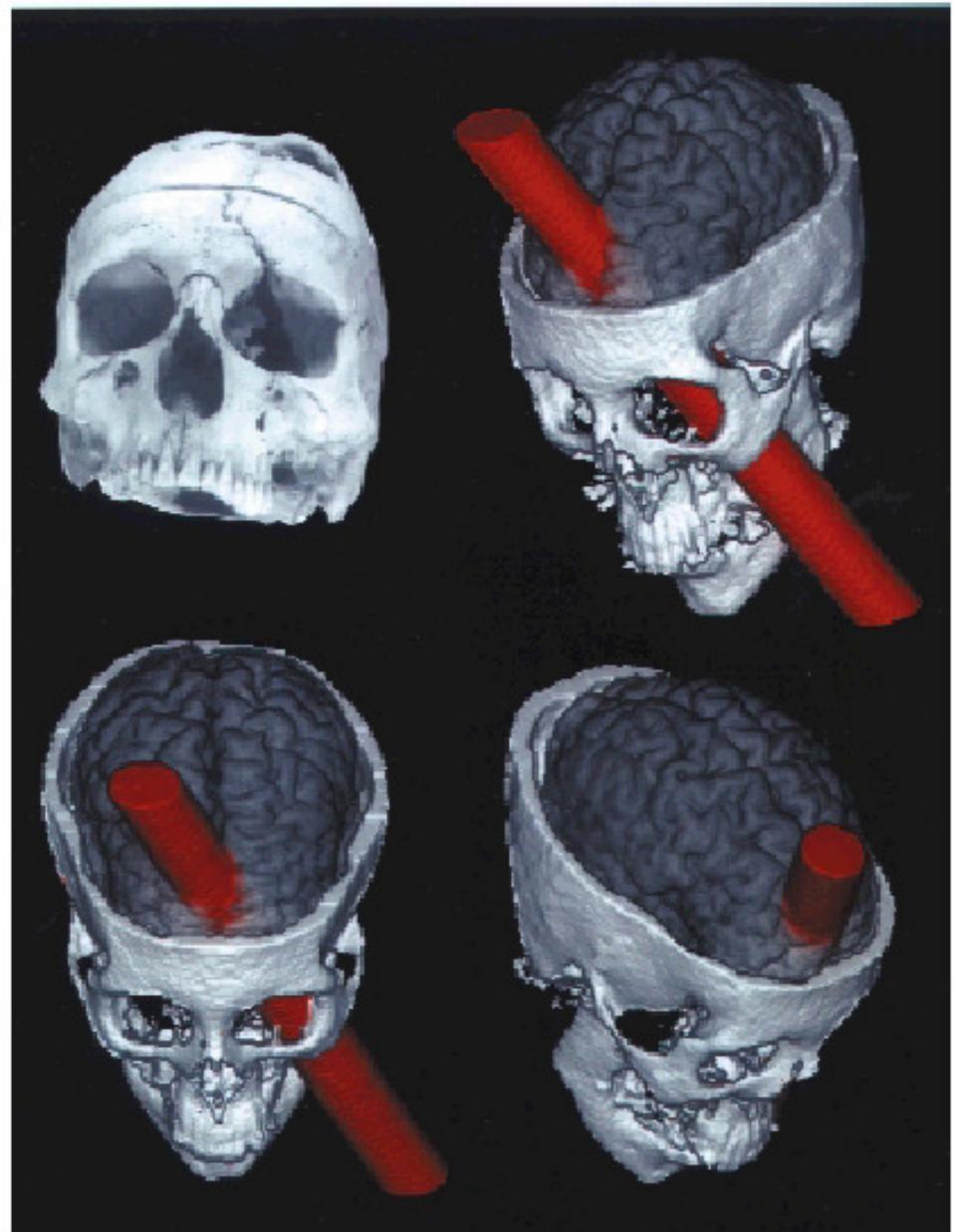


Skull and death mask  
of Phineas Gage

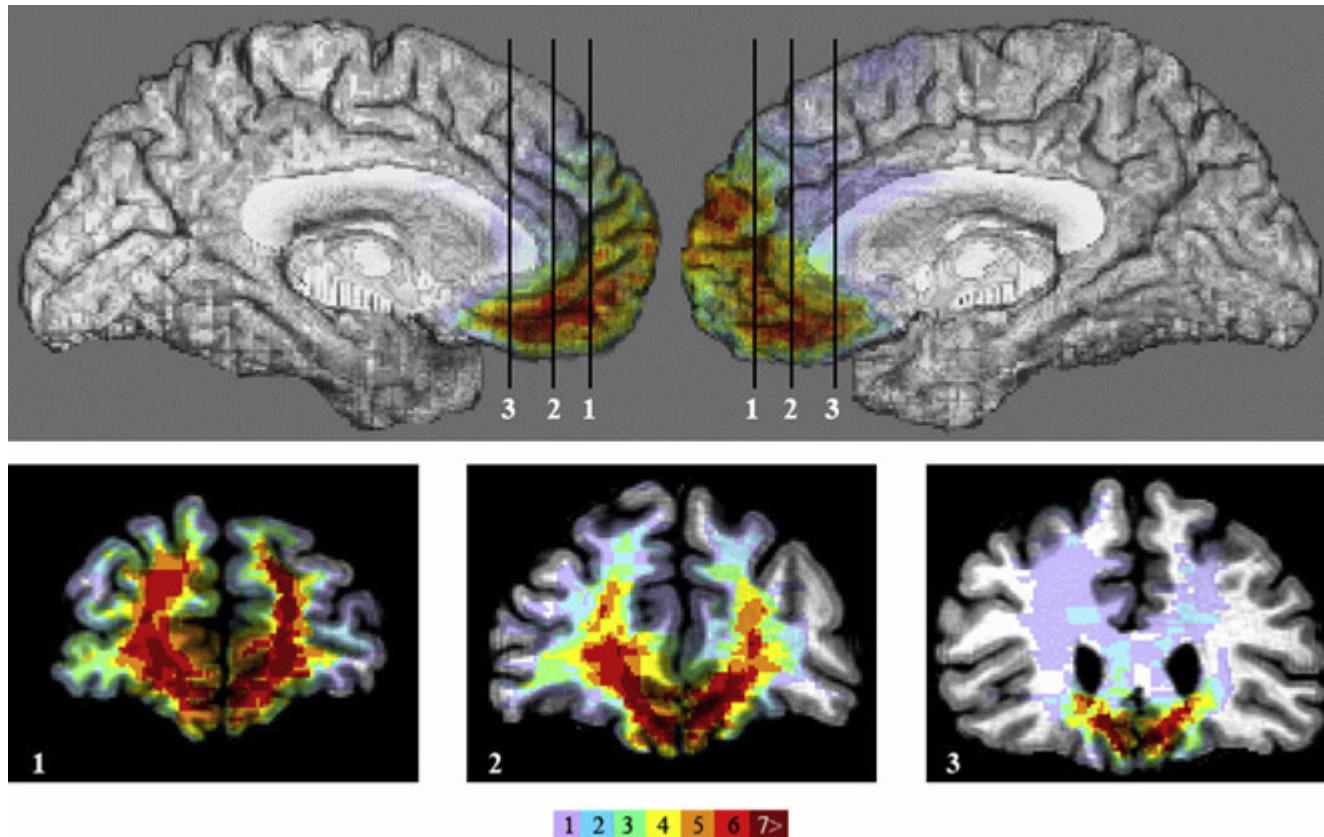




*Raymond J. Dolan, 1999*



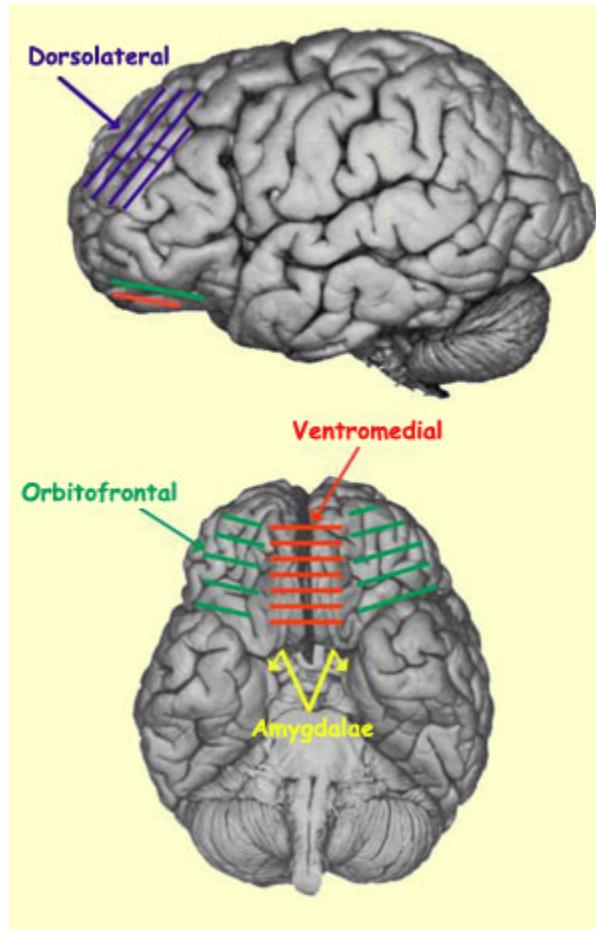
**Fig. 1.** Reconstruction of the lesion incurred by Phineas Gage, in which an iron bar was driven through his prefrontal cortex as a result of a blasting accident. Courtesy of Hannah Damasio.



Antonio Damasio's patients:

Orbitofrontal / ventromedial prefrontal cortex

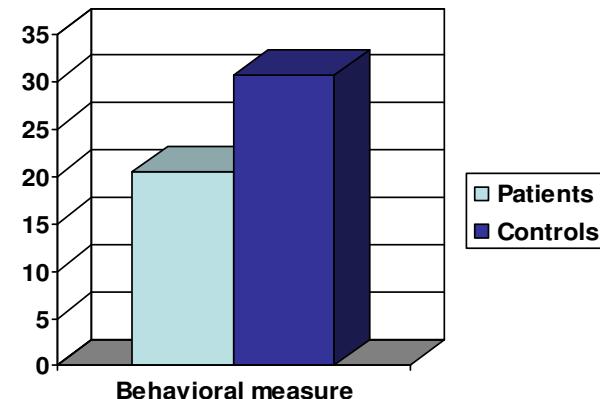
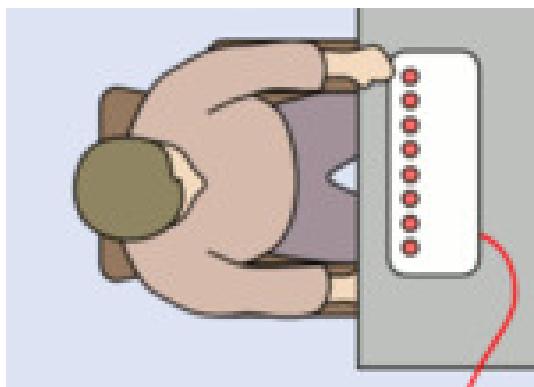
Neuron. 2010 Mar 25;65(6):845-51.



**Ventro-medial prefrontal cortex** is involved in emotional learning, anticipation of the future positive and negative consequences of the action.

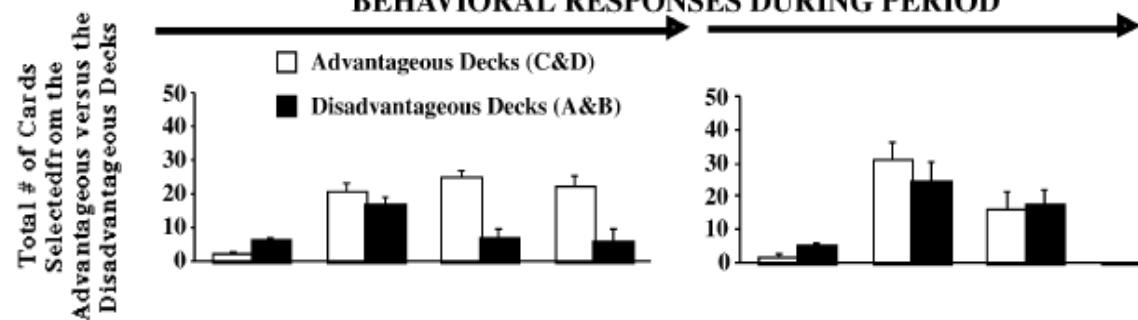
# Read “Lesion” results

Behavioral responses



Normal

Ventromedial Prefrontal



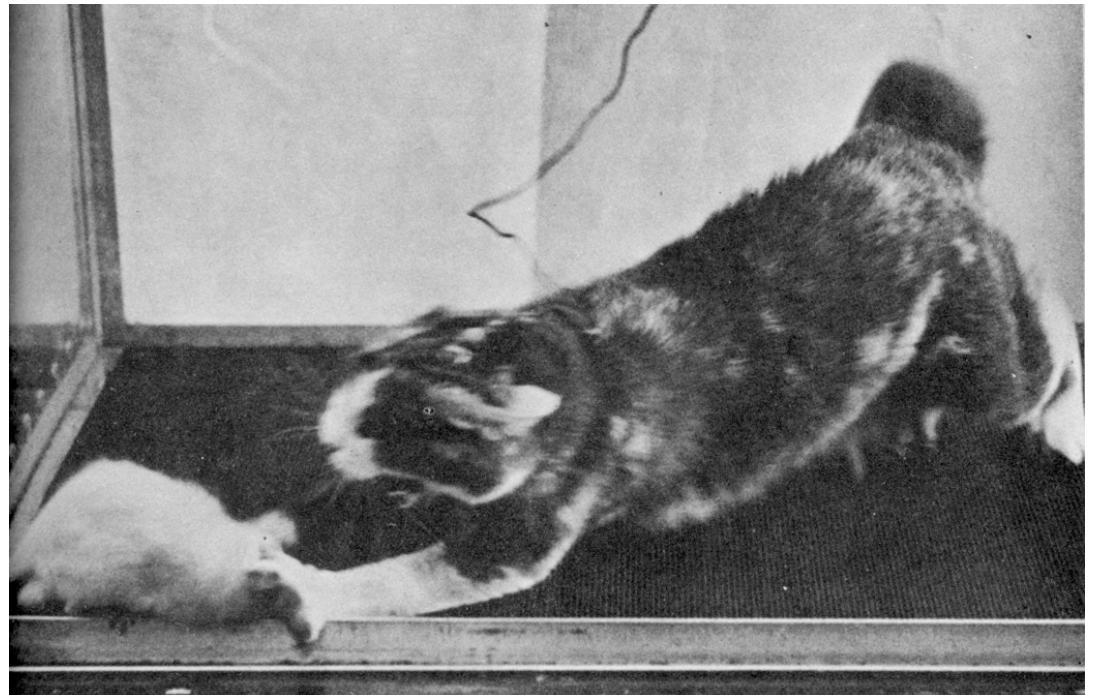
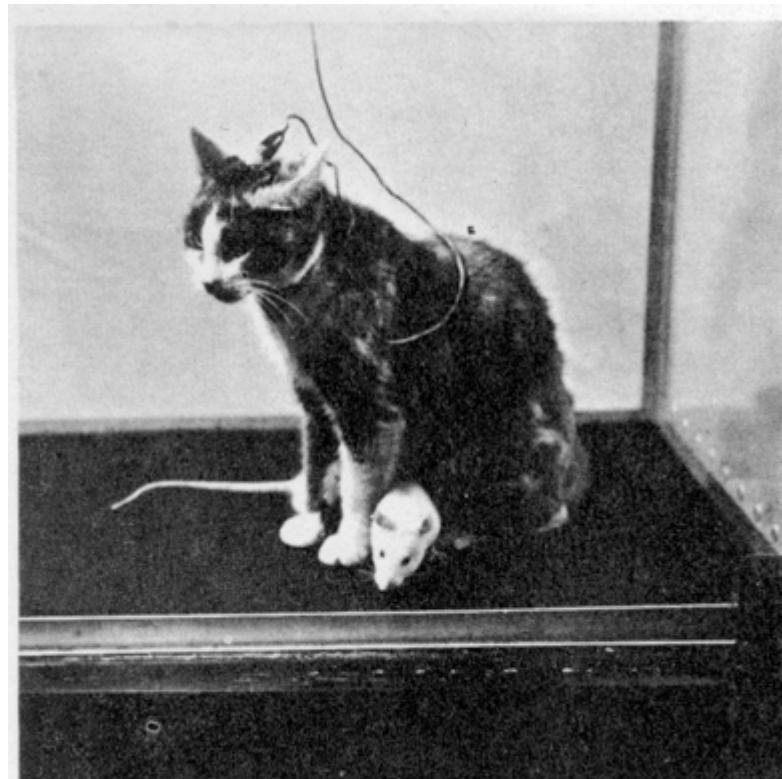
# Lesions: Advantages vs. disadvantages

- often rare
- usually not focal
- consequences are long-term
- can be compensated by brain plasticity
- a possibility of fuzzy interpretations
- show the **casual** role of the brain region
- bring unique insights

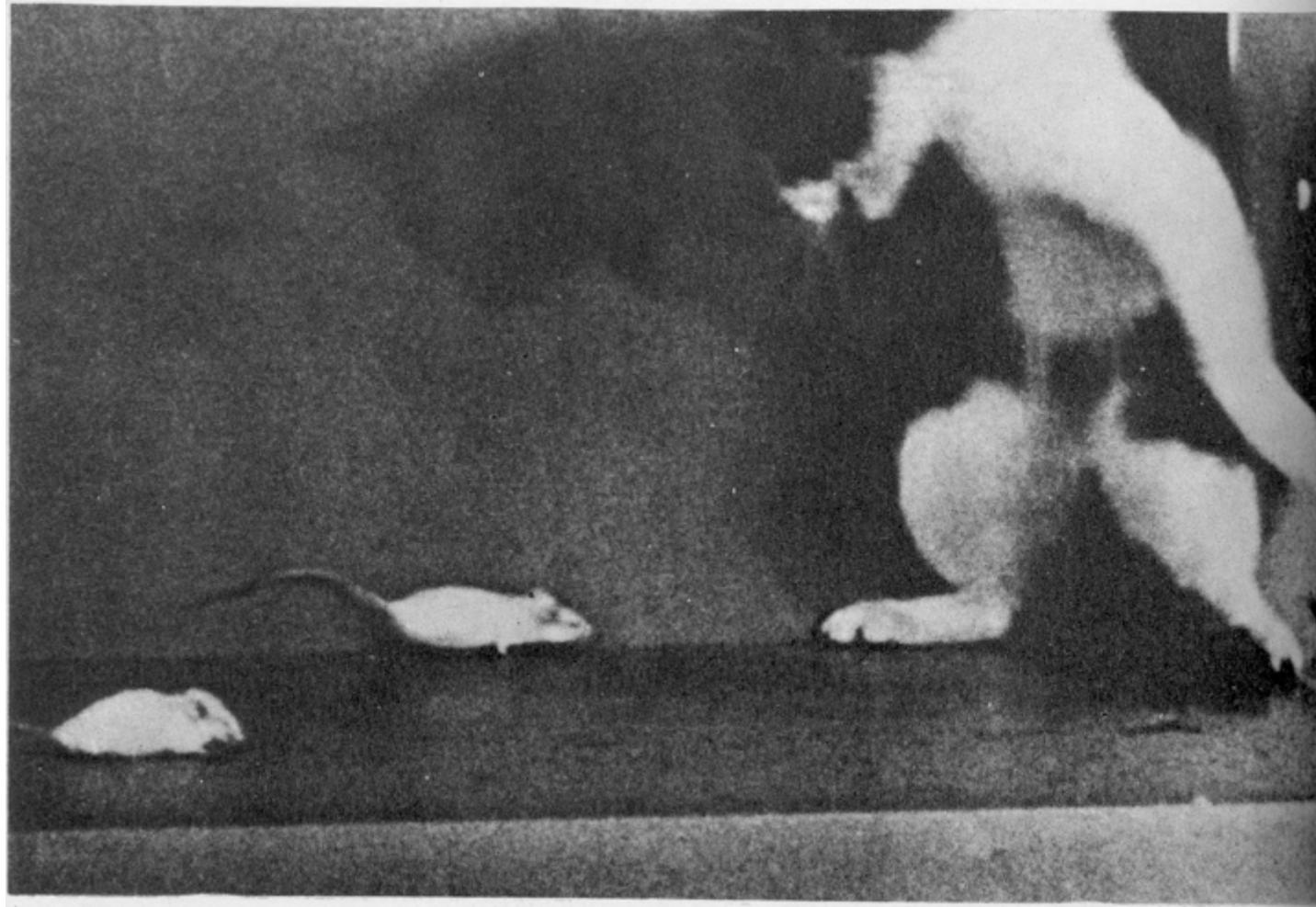


## II. Stimulation of the brain





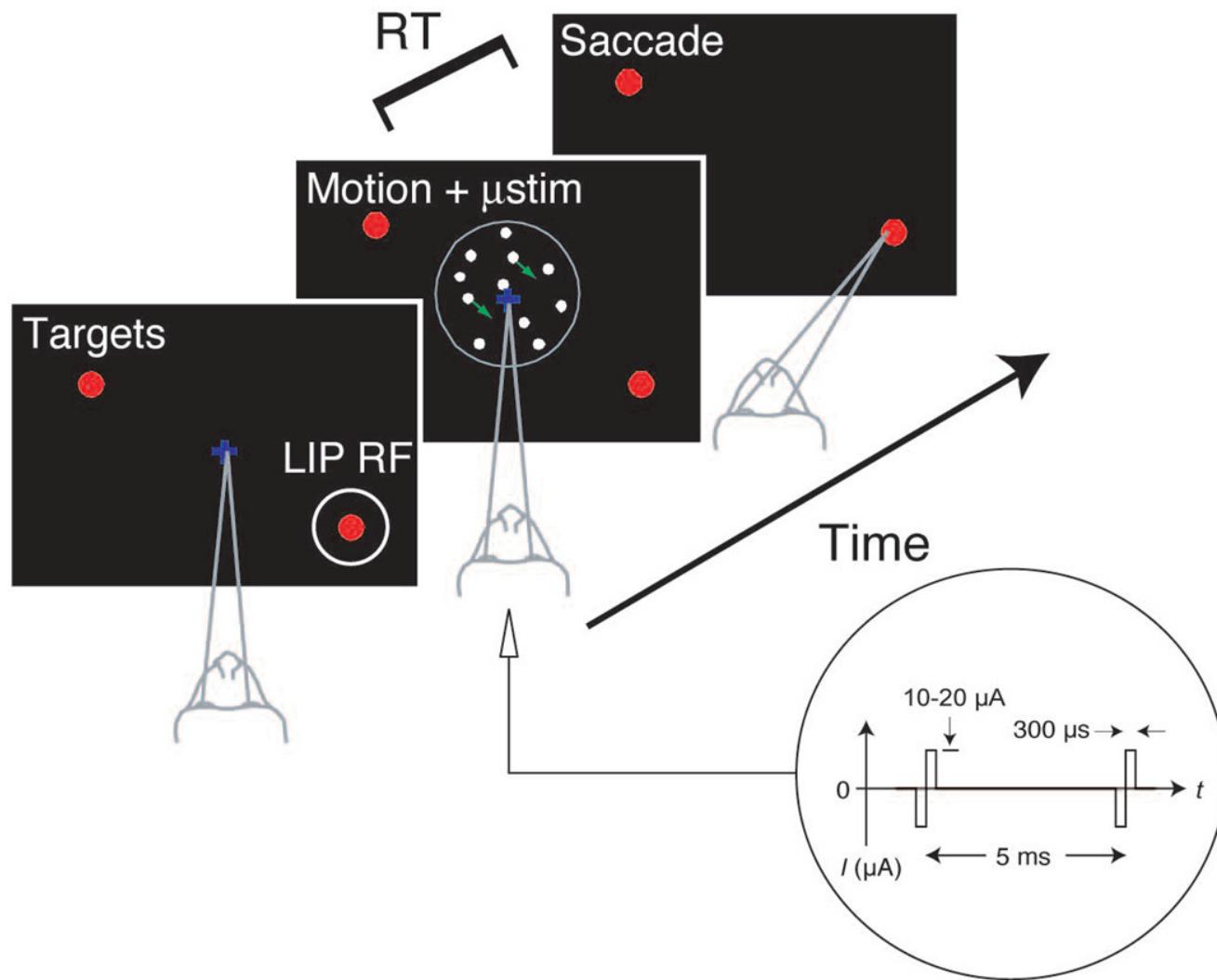
In the 1960s Flynn found that electrical stimulation of lateral hypothalamus elicits predatory aggression in cats, whereas stimulation of the medial hypothalamus elicited vicious attack behaviour.



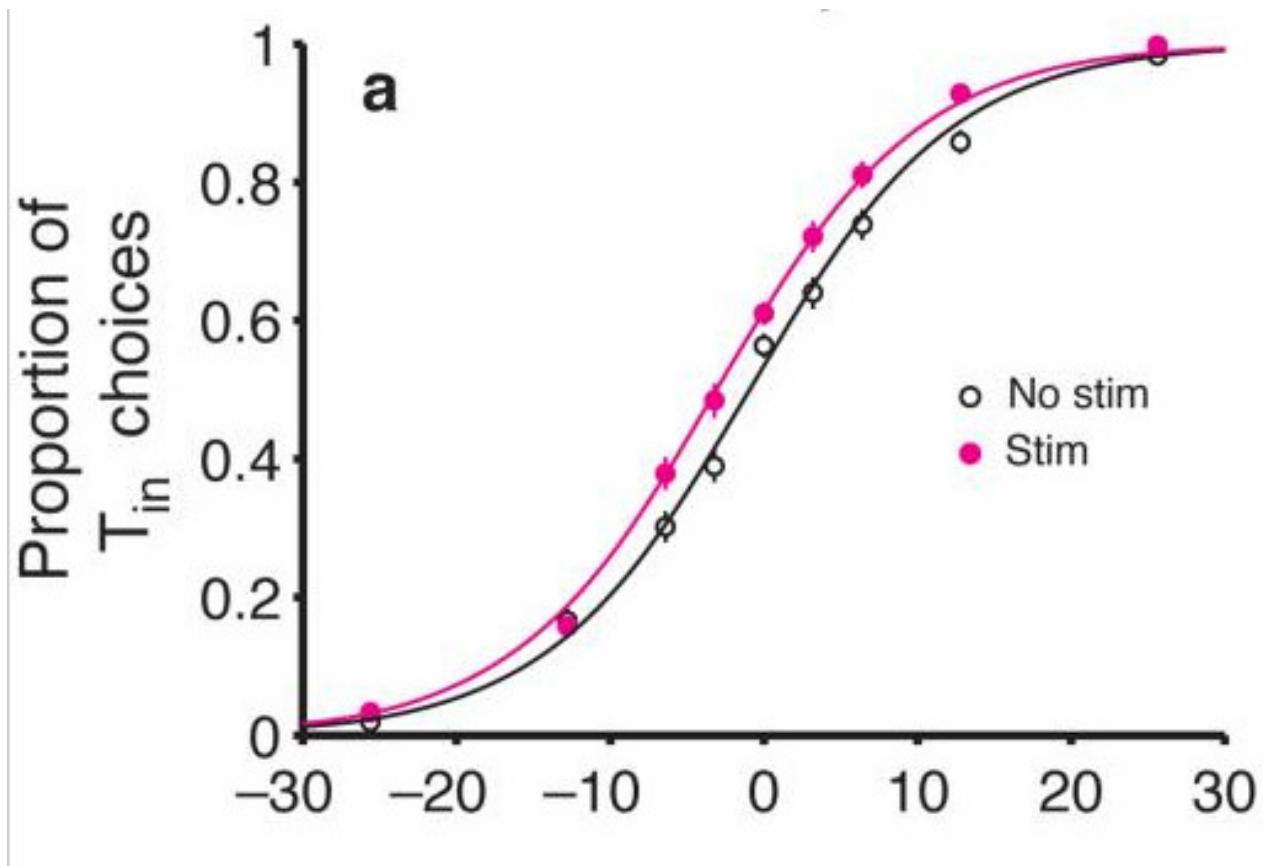


Jose Delgado's "Physical Control of the Mind"

# Perceptual decisions



Nat Neurosci. May 2006; 9(5): 682–689.



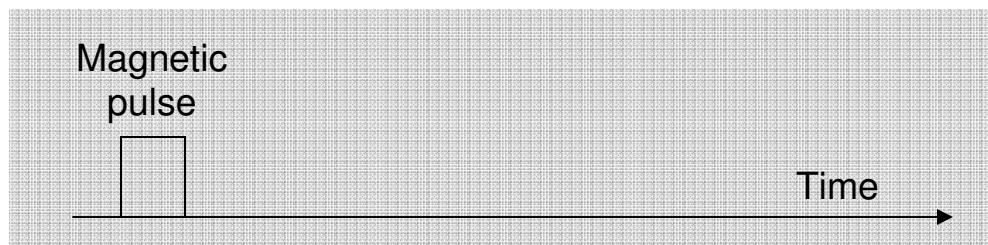
Nat Neurosci. May 2006; 9(5): 682–689.

# Stimulation: Advantages vs. Disadvantages

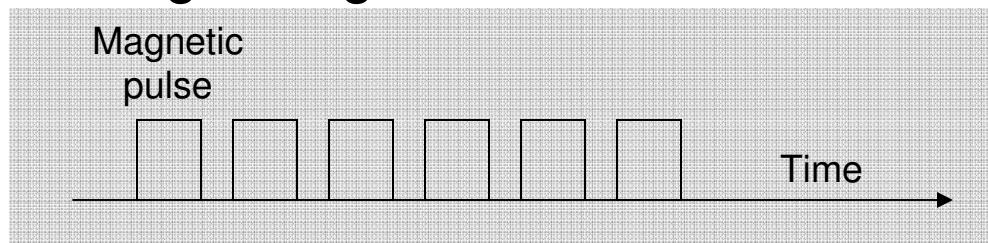
- Short-term effects
- Invasive (damages tissues)
- Normally can not be applied to humans
- Relatively not-focal, i.e. you could unintentionally stimulate many regions at the same time
- Possible fuzzy interpretations (similar to lesions study)

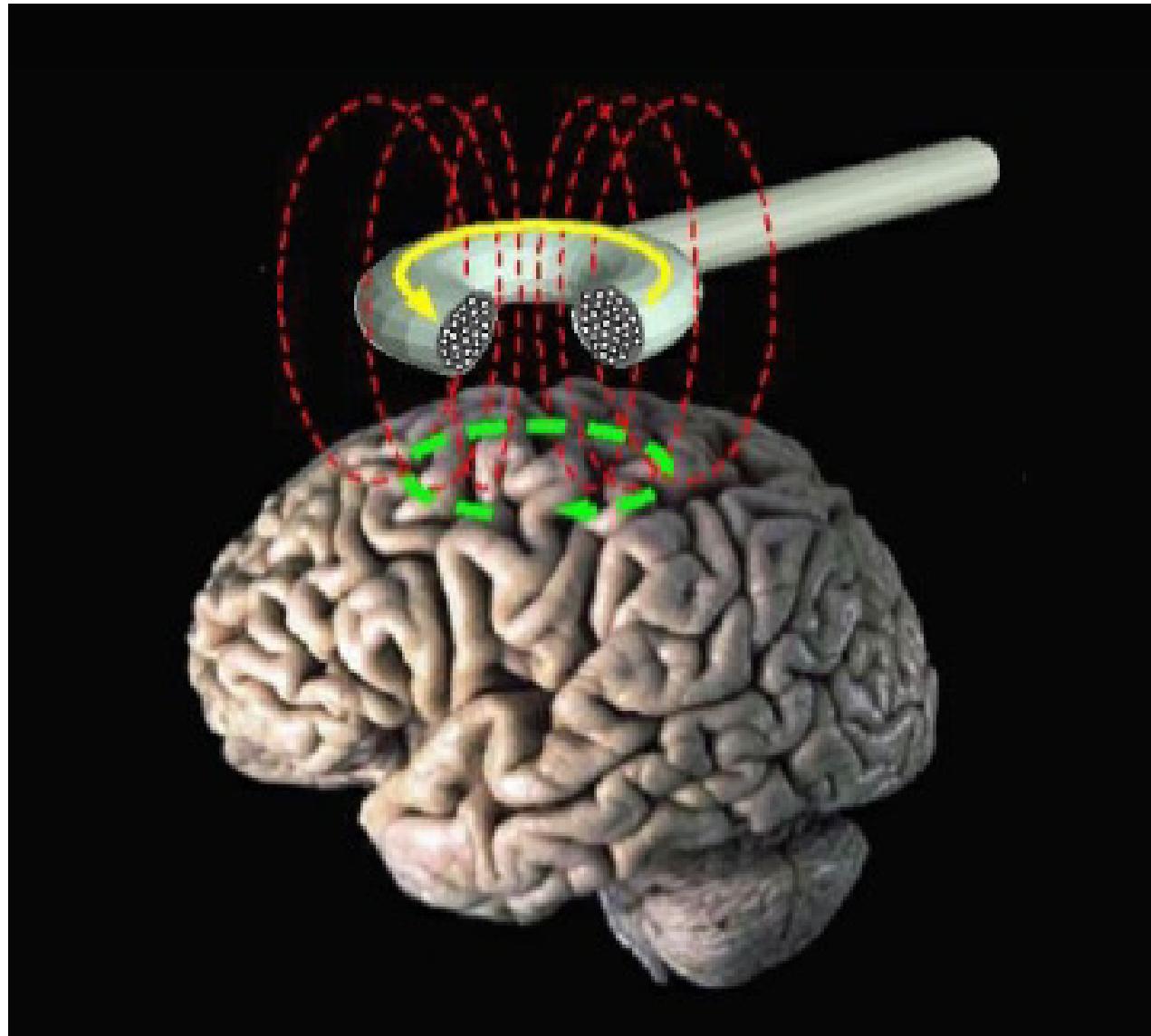
# III. TMS – Transcranial Magnetic Stimulation

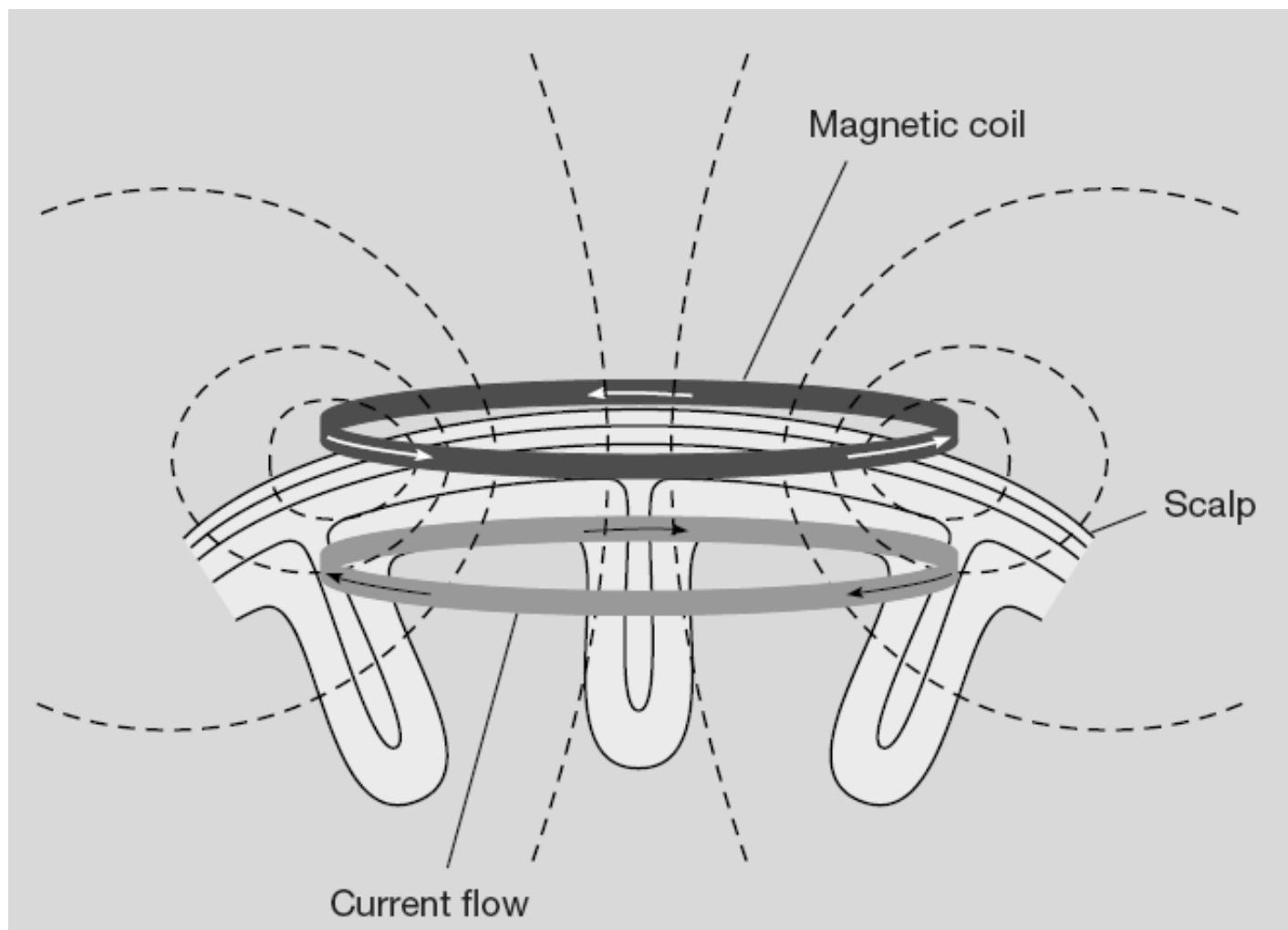
**TMS** - rapidly changing magnetic fields (electromagnetic induction) induce weak electric currents in the brain, i.e. affect neurons.

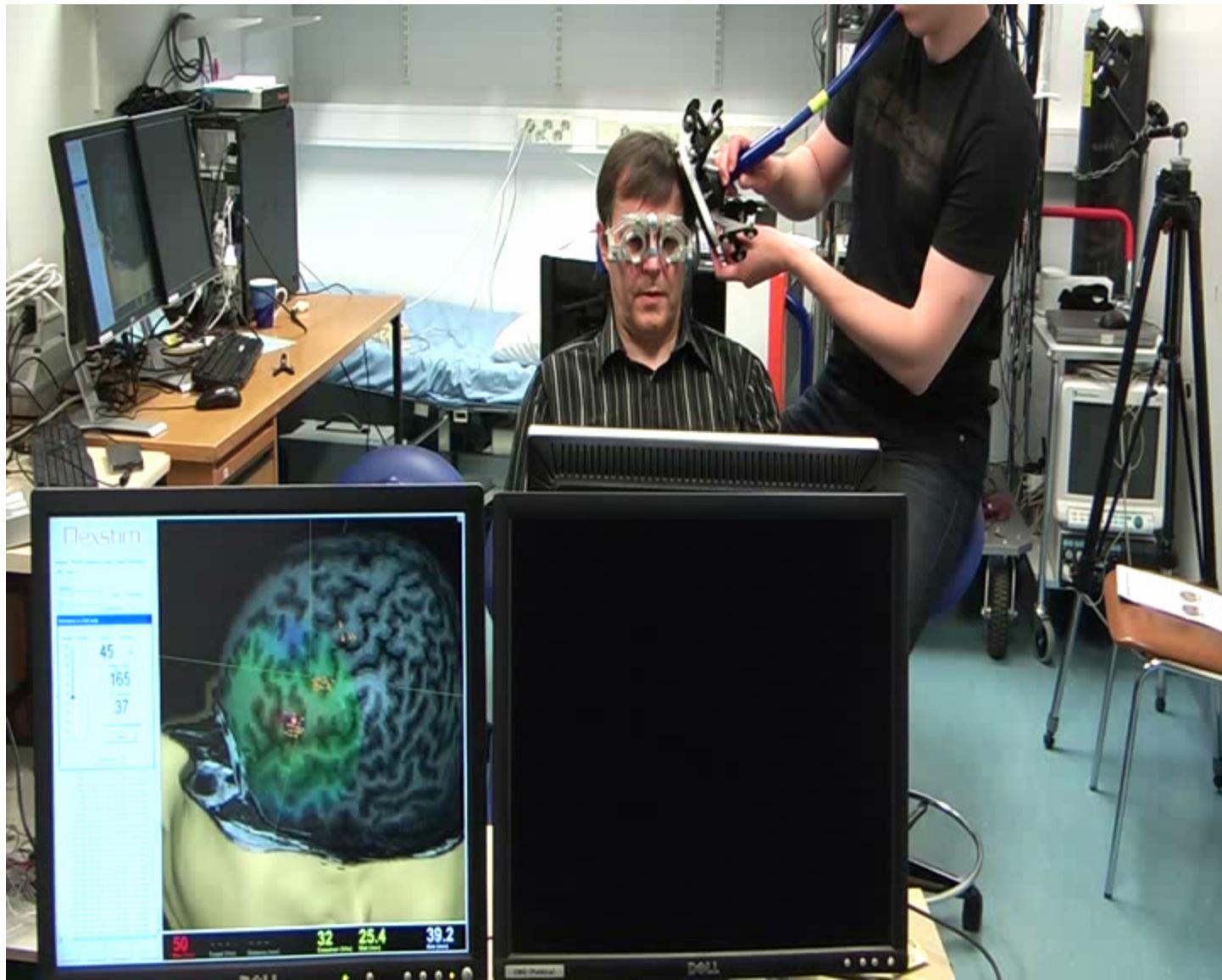


*Repetitive TMS (rTMS)* – repetitive TMS pulses. rTMS produce longer lasting changes.

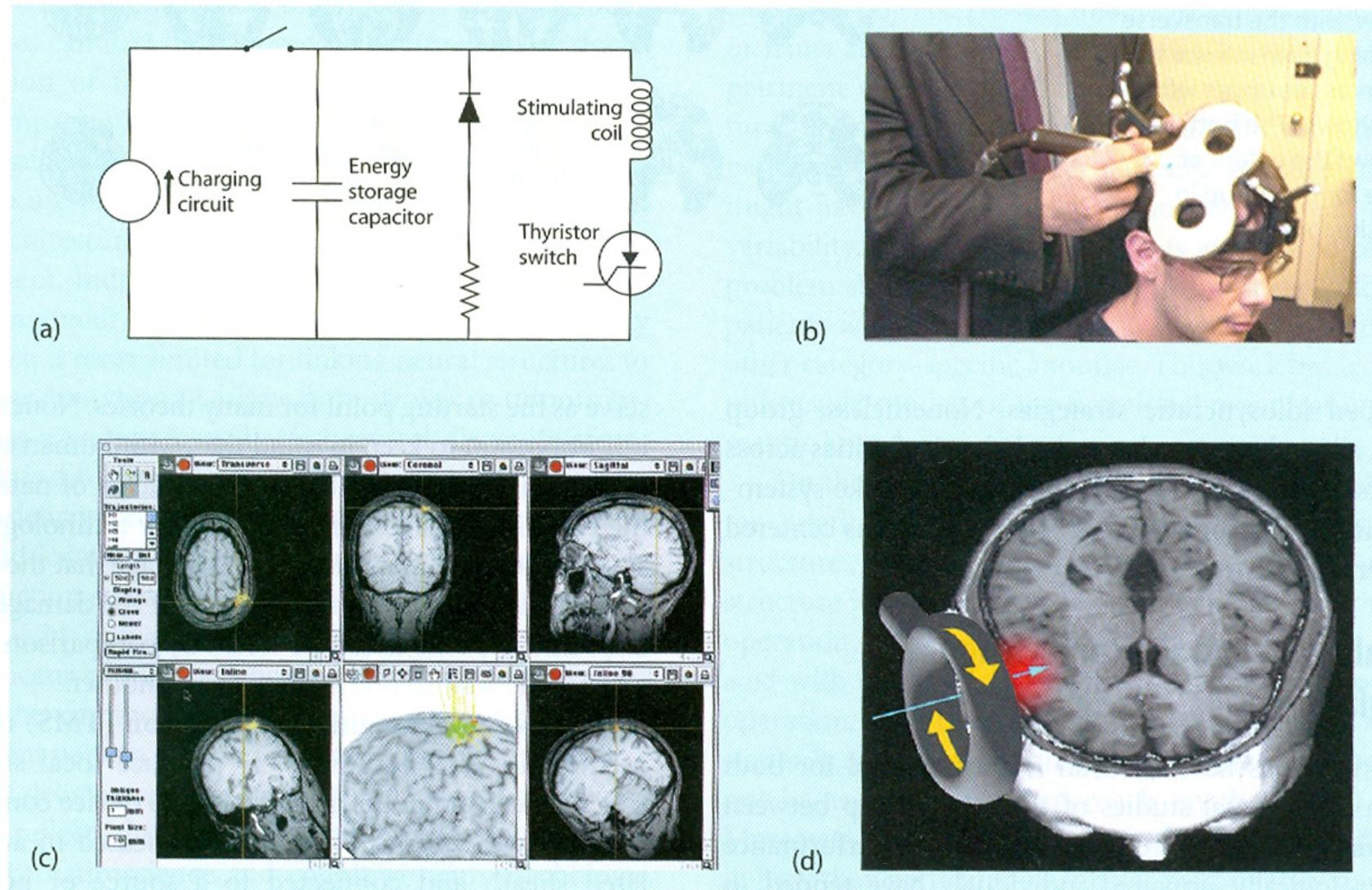






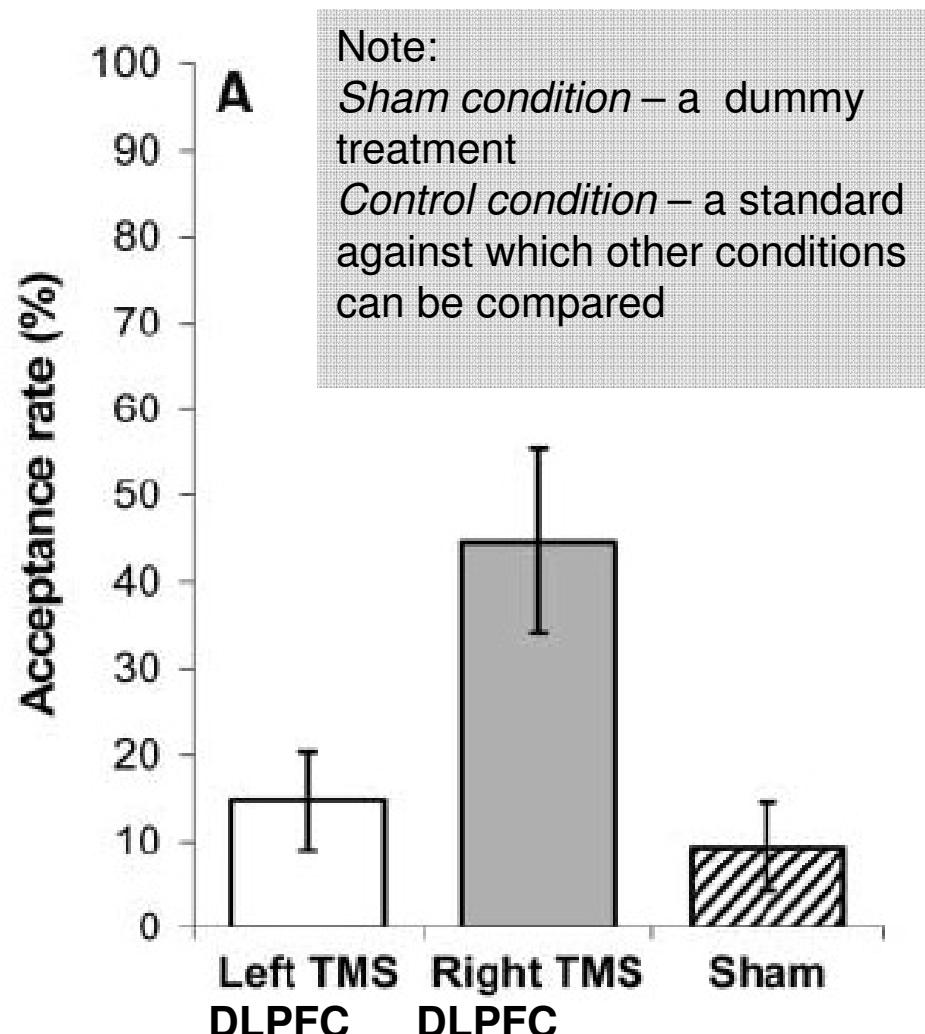


**Figure 4.25** Transcranial magnetic stimulation. **(a)** This schematic shows the electrical circuit used to induce the TMS pulse. **(b)** Here the TMS coil is being applied by an experimenter. Both the coil and the subject have affixed to them a tracking device to monitor the head/coil position in real time. **(c)** The subject's MRI can be used along with the tracking system to display the cortical area being targeted. **(d)** The TMS pulse directly alters neural activity in a spherical area of approximately  $1\text{ cm}^3$ .



# Read TMS results

**Figure** Acceptance rates of unfair financial offers across treatment groups. Subjects whose right DLPFC is disrupted exhibit a much higher acceptance rate than those in the other two treatment groups.



# TMS: Advantages vs. disadvantages

- Transient or long-term effects
- Shows causal neural mechanisms
- Difficult to stimulate deep brain areas
- There are medical limits for MF exposure
- Produces loud sounds and muscles constructions
- A mild risk of epileptic seizures

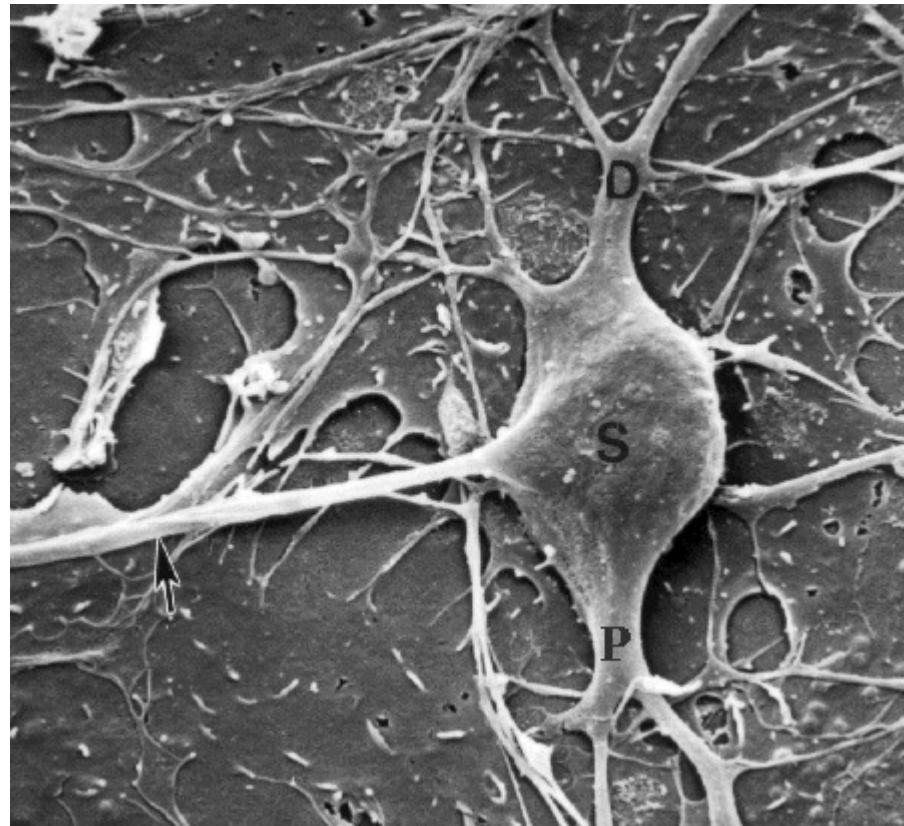
Compare the size of a neuron:

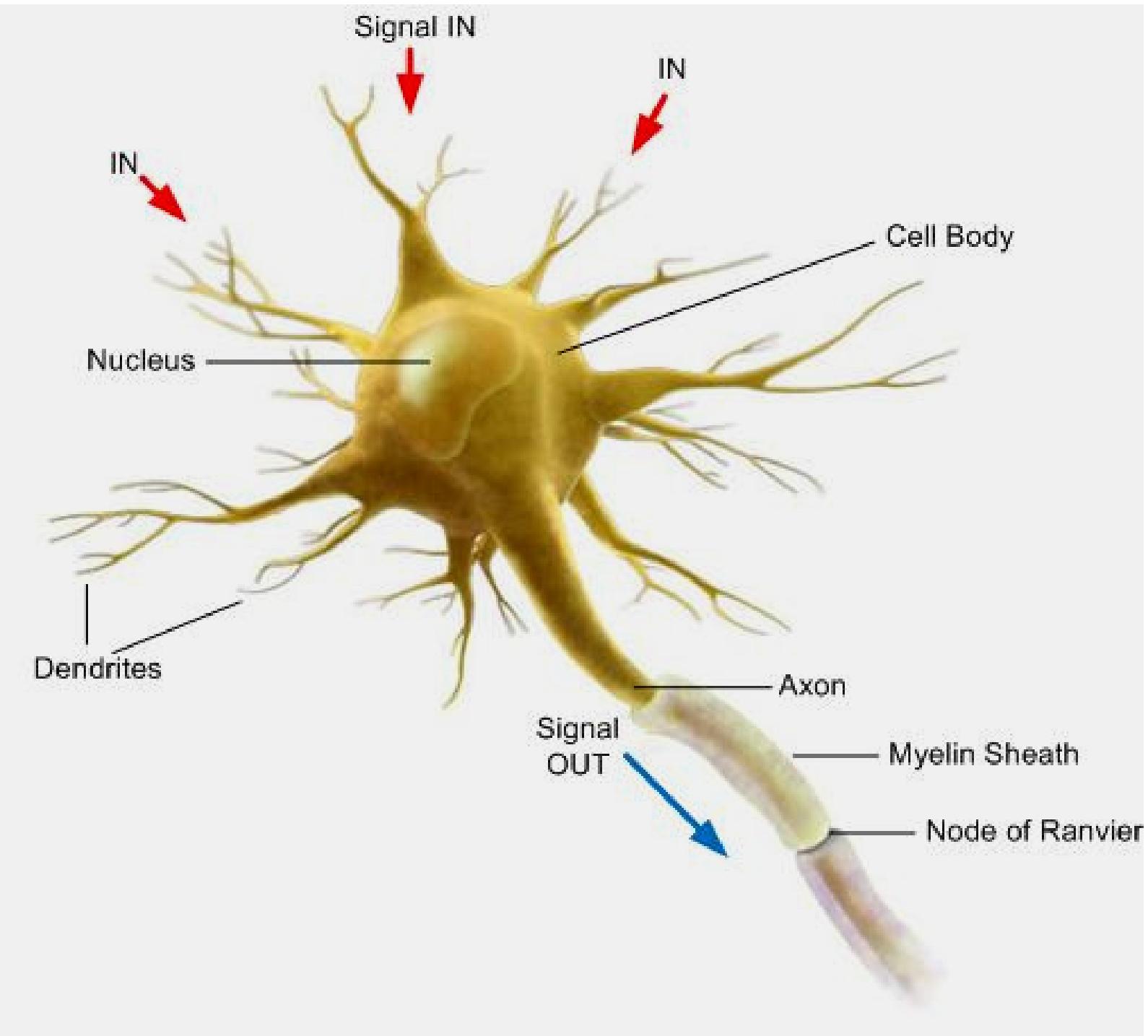
To the tip of an unsharpened pencil (from 40x (shown) to 200x bigger!):



The typical size of neurons is between 10 - 50 micrometers (1  $\mu\text{m}$ , 0.000001 meters)

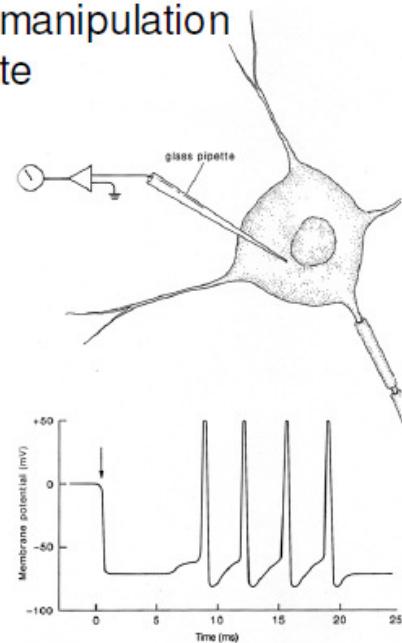
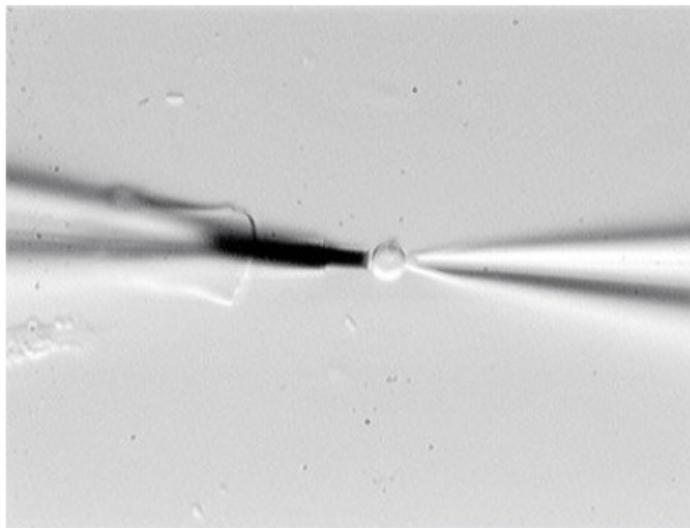
<http://www.ualberta.ca/~neuro/OnlineIntro/NeuronExample.htm>





# Single cell recording

**Single cell recording** – Determine experimental manipulation that produce a consistent change in of the firing rate

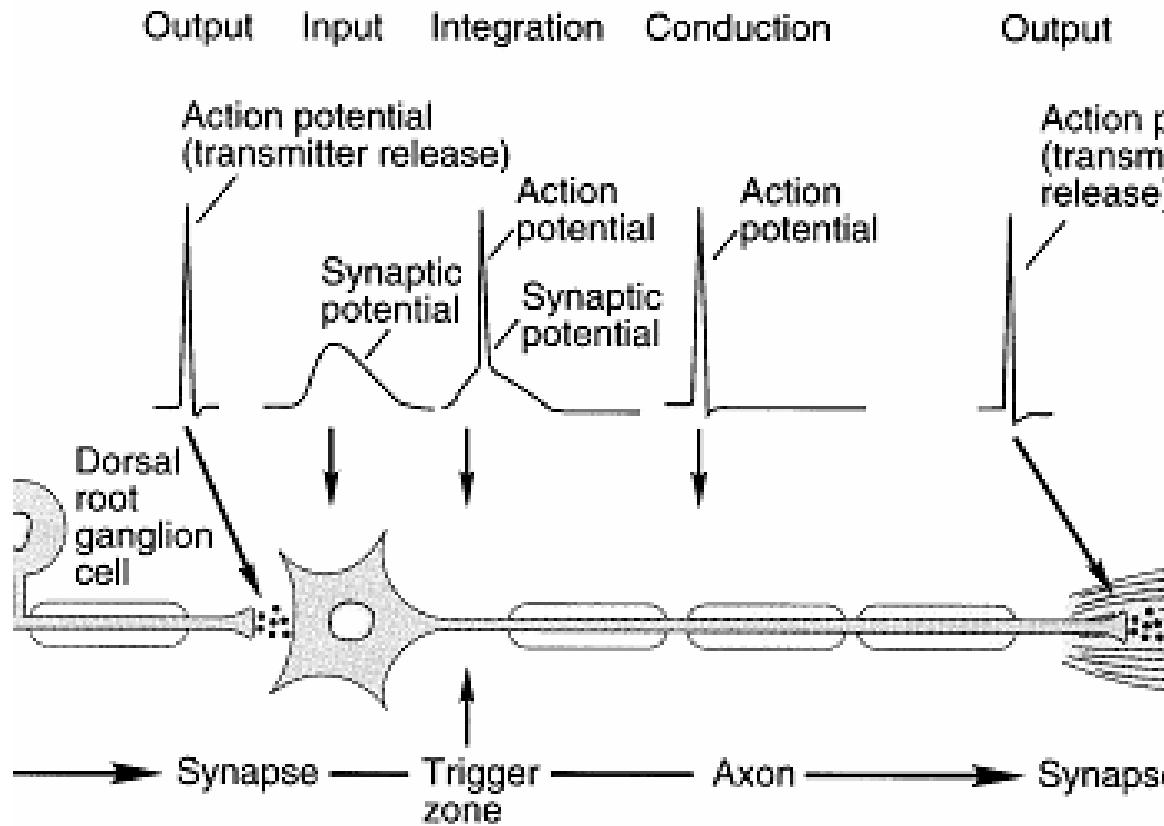


The fiber diameter is 6  $\mu\text{m}$

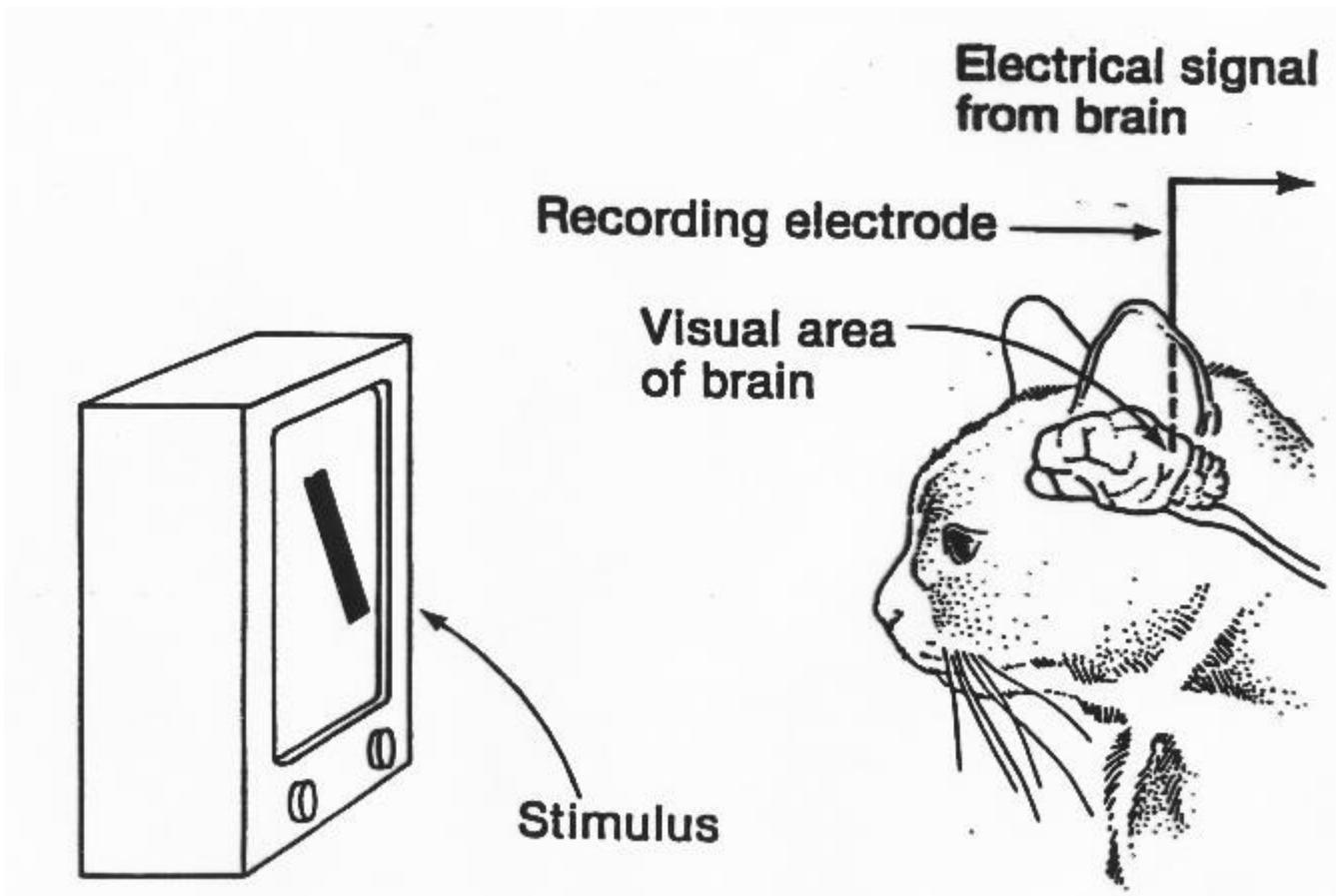
**Firing rate – average number of action potentials**

<http://www.vandenhul.com/artpap/lsc-neuro.htm>

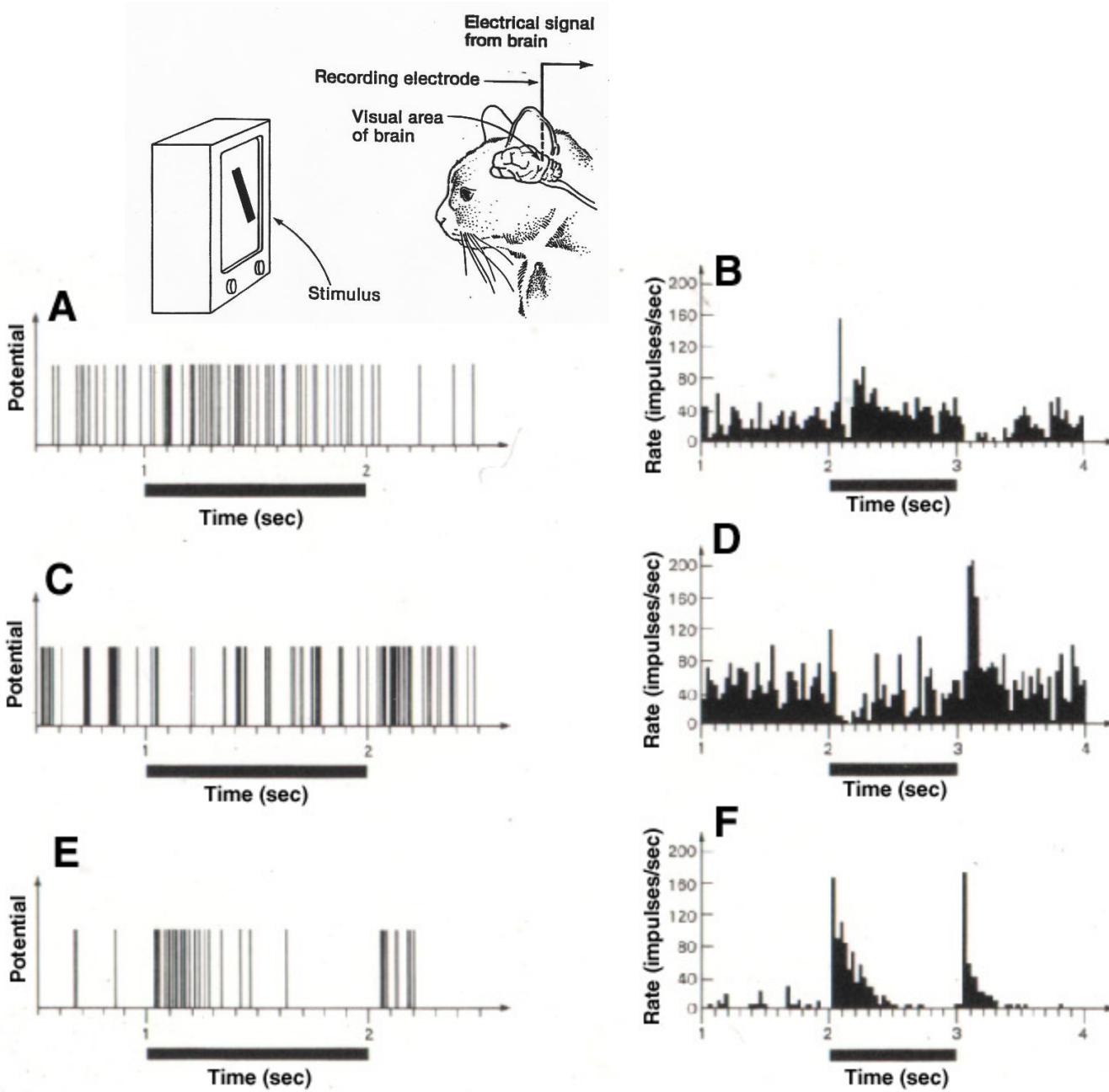
## Firing rate – average number of action potentials



The neuron can be modelled as a computational element which sums its inputs within its time-constant and, whenever this sum, minus inhibitory effects, exceeds a threshold, produces an action potential which propagates to all of its outputs.



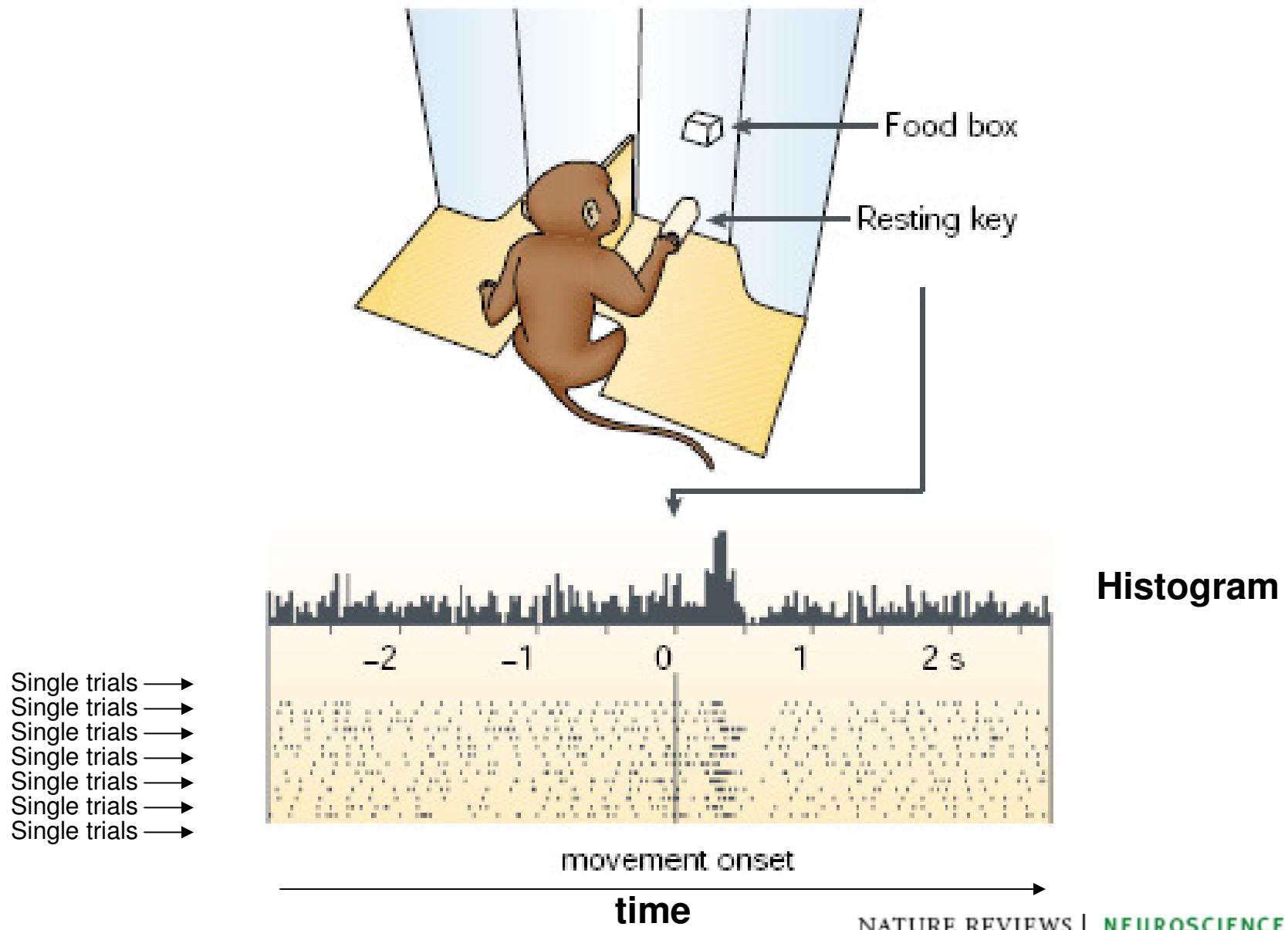
[www.caip.rutgers.edu/~feher/SandP/prep1\\_5.html](http://www.caip.rutgers.edu/~feher/SandP/prep1_5.html)



## Single spikes

## Histograms

# Read results

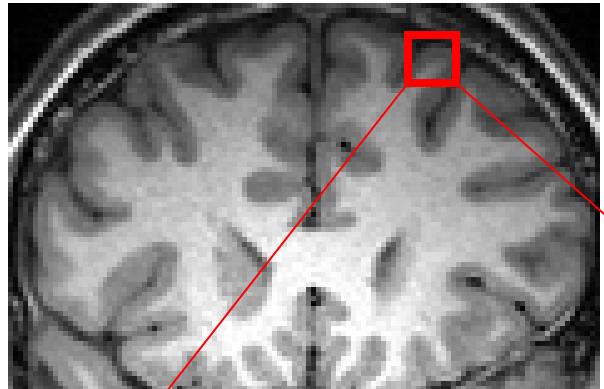


# Single-/multi-unit recording: Advantages vs. disadvantages

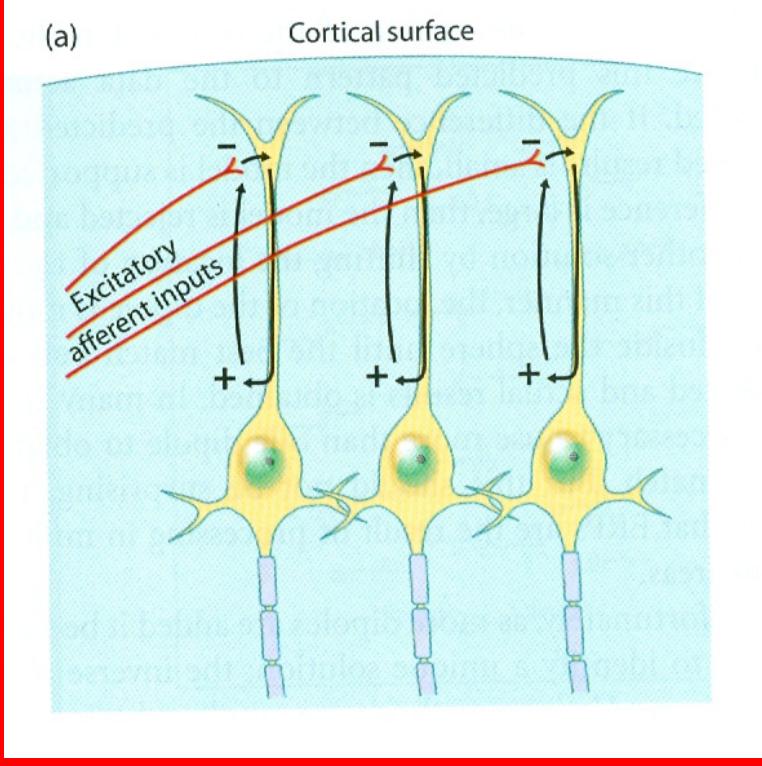
- The only direct measure of neuronal activity
- Invasive (needs an operation)
- Limited to few neurons
- Unclear information code

# V. EEG & MEG

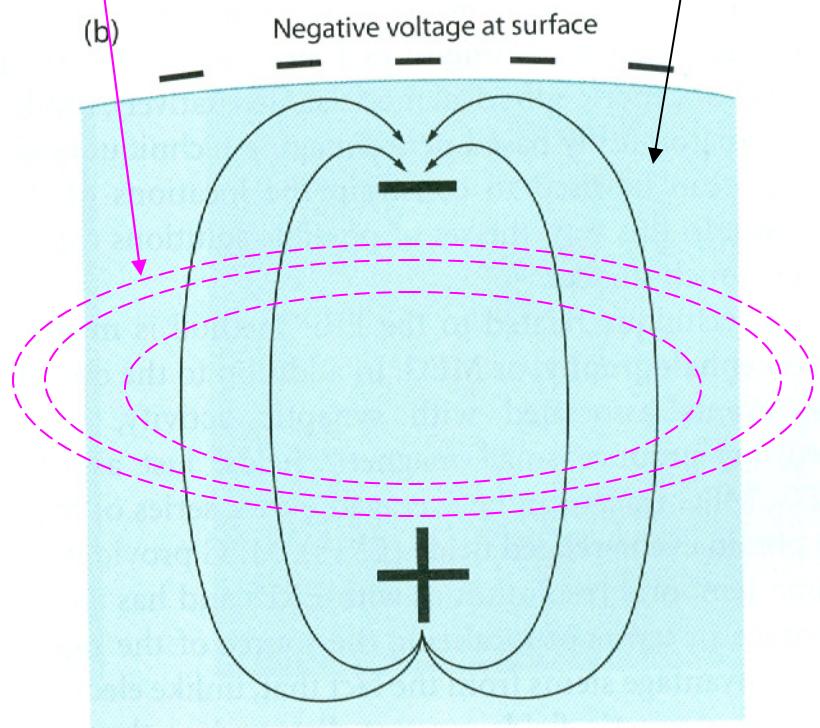
- Electroencephalography (EEG) is the recording of electrical activity along the scalp produced by the firing of neurons within the brain.
- Magnetoencephalography (MEG) measures the magnetic fields produced by electrical activity in the brain.

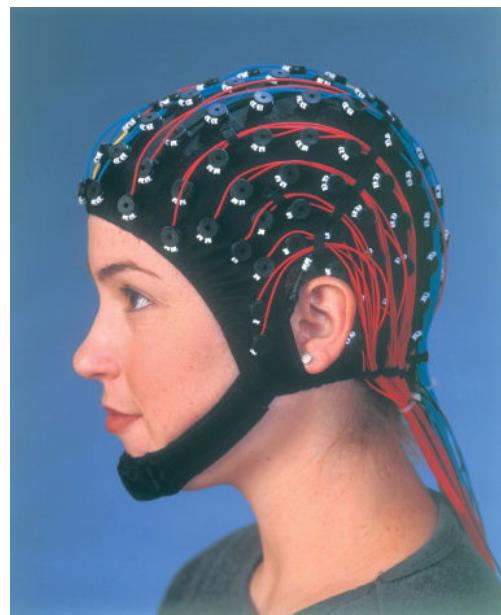


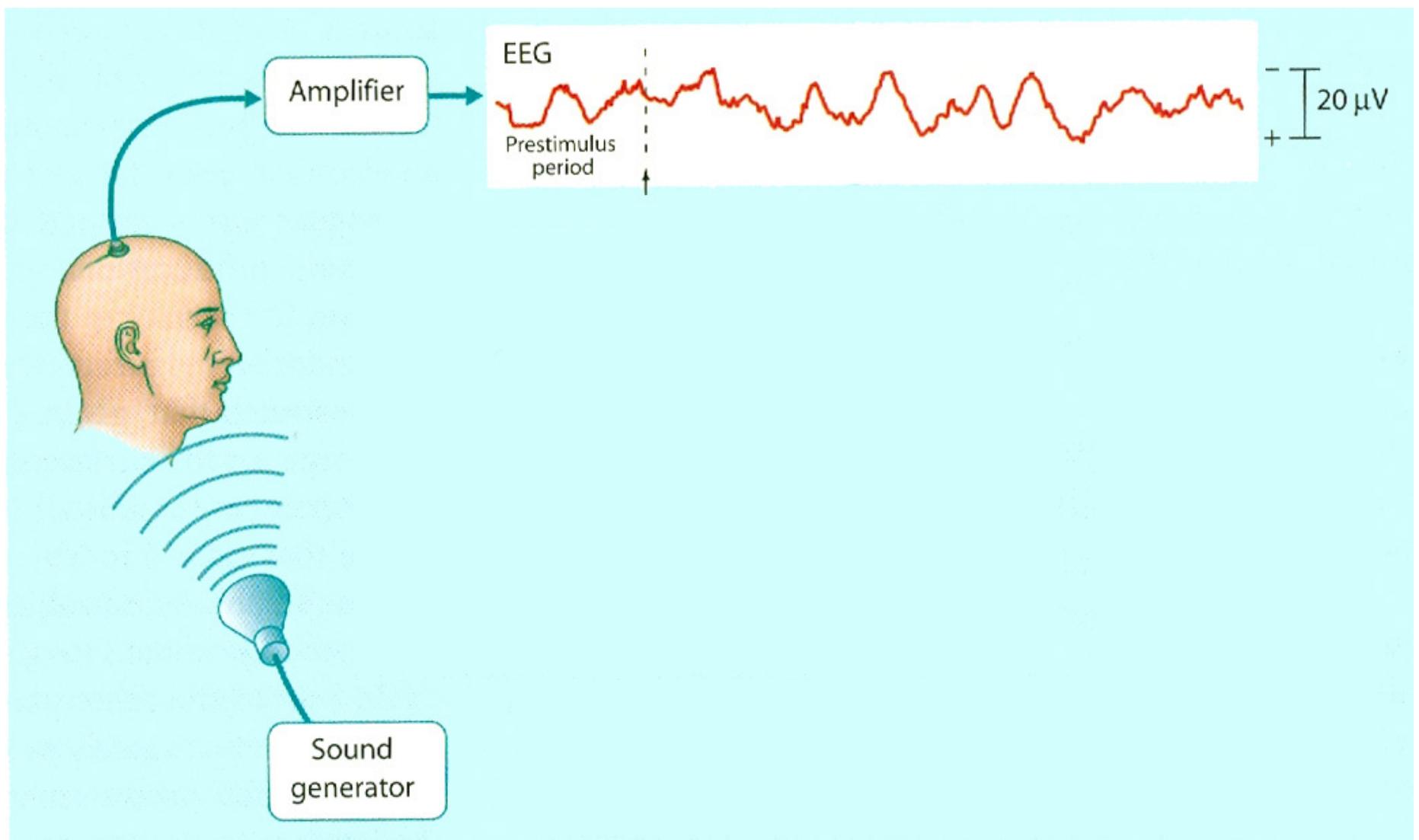
Magnetic field  
Source  
of  
**MEG**

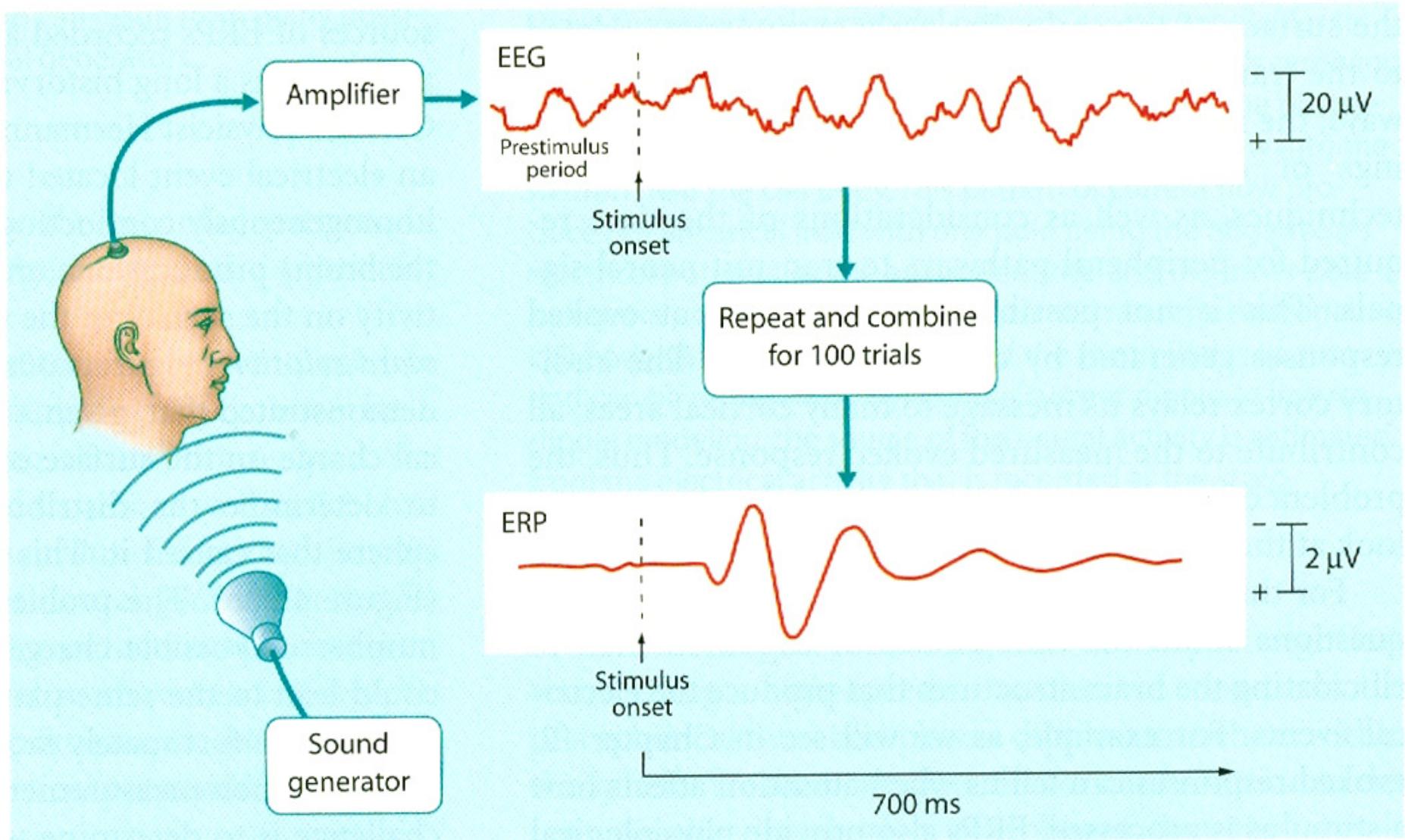


Electrical current  
Source  
of  
**EEG**











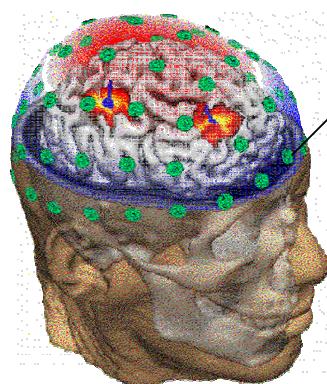
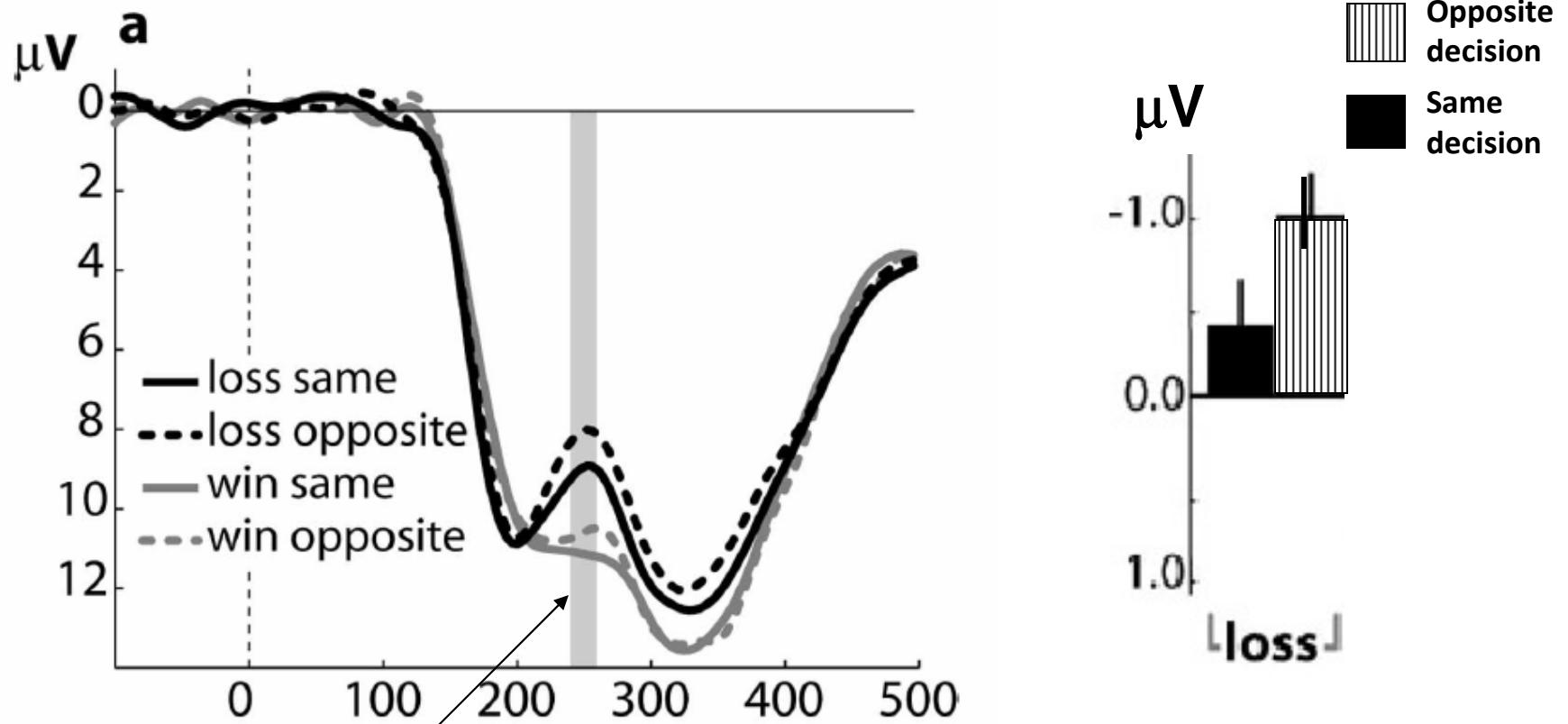
## Matching pennies

The game is played between two players, Player A and Player B.

Each player has a penny and must secretly turn the penny to heads or tails.

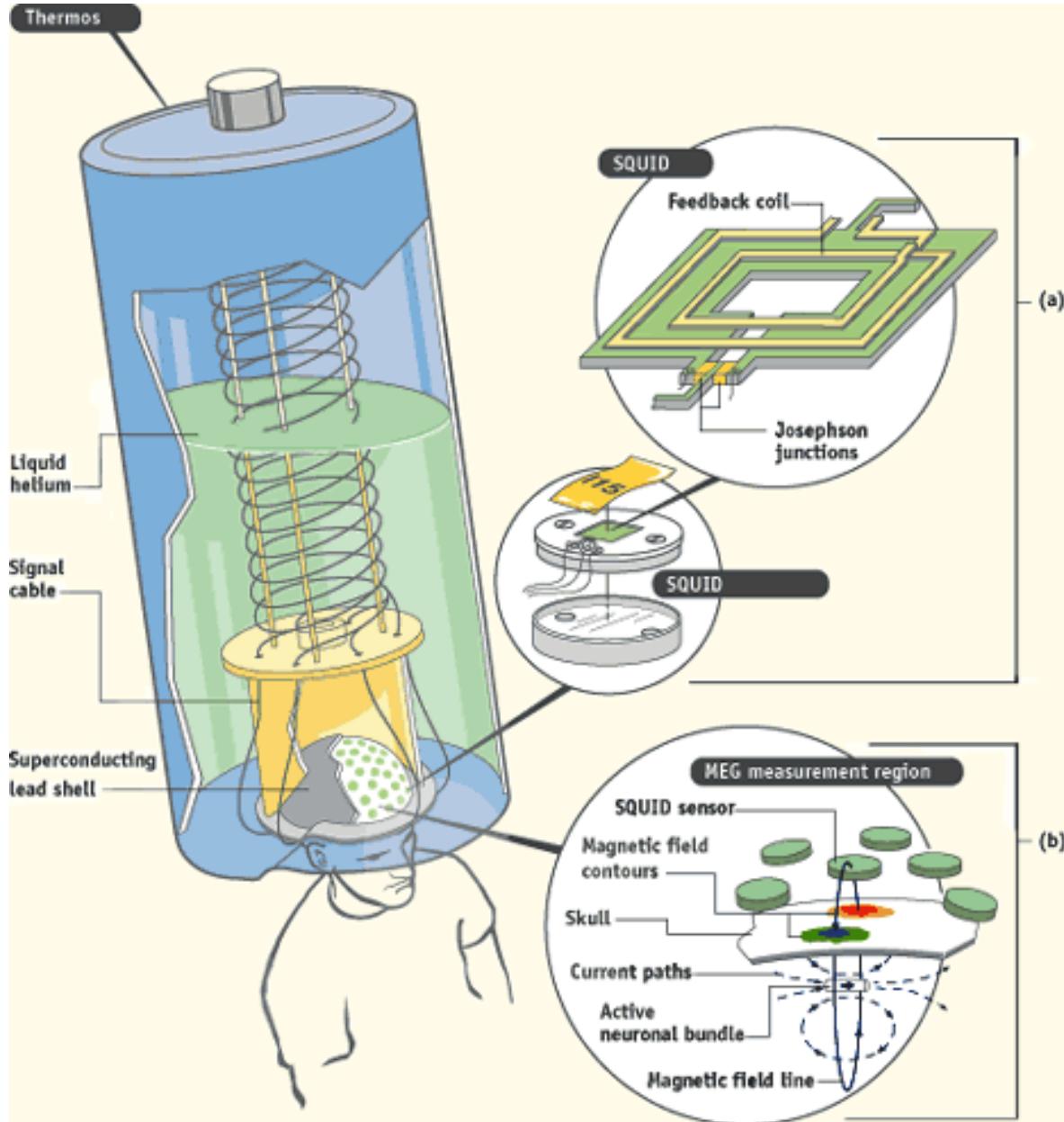
If the pennies match (both heads or both tails) Player A keeps both pennies.

If the pennies do not match (one heads and one tails) Player B keeps both pennies,



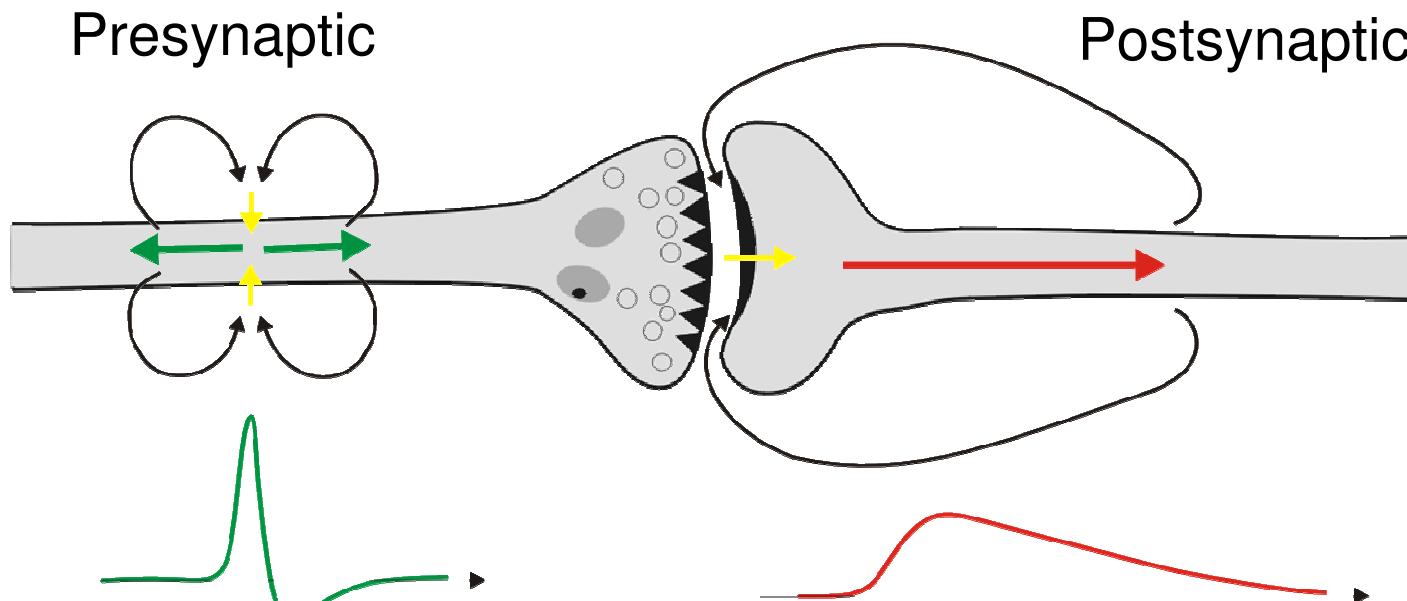
Feedback-locked ERPs sorted according to current outcome and future decision. ERPs after losses (black) and wins (gray) separated according to whether subjects chose the opposite (dashed lines) or the same (solid lines) target on the following trial as on the current trial. Light gray bar indicates time window used for analyses.

Cohen, M. X et al. J. Neurosci. 2007;27:371-378



MEG measures the magnetic fields produced by electrical activity in the brain via extremely sensitive devices such as superconducting quantum interference devices (SQUIDs).

# Currents in axons and dendrites



Action potentials:

- Fast: no/little temporal summation
- Cancellation: fields diminish rapidly

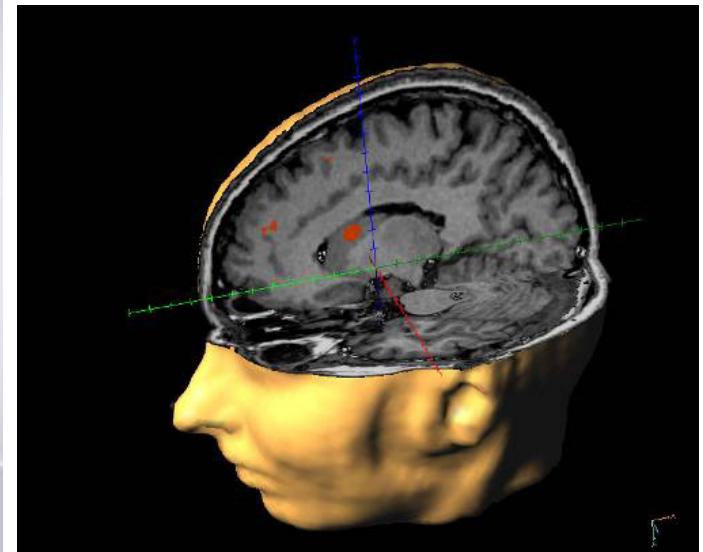
Postsynaptic potentials:

- Longer lived
- Main source of MEG and EEG

# Advantages vs. disadvantages of MEG and EEG

- EEG is cheap
- MEG is quite expensive
- Perfect time resolution
- Relatively bad spatial resolution

# VI. functional Magnetic Resonance Imaging - fMRI



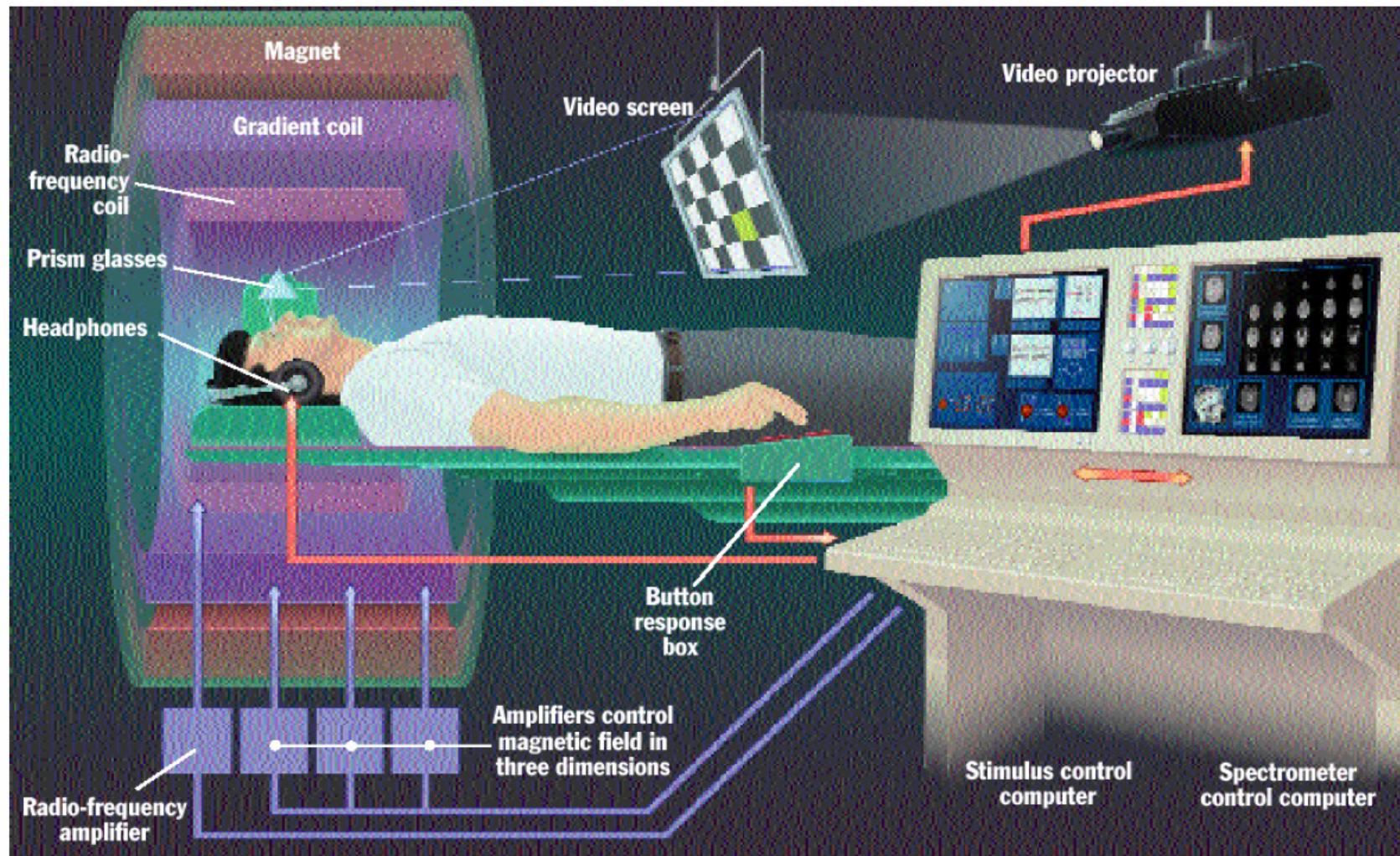
# **FUNCTIONAL**

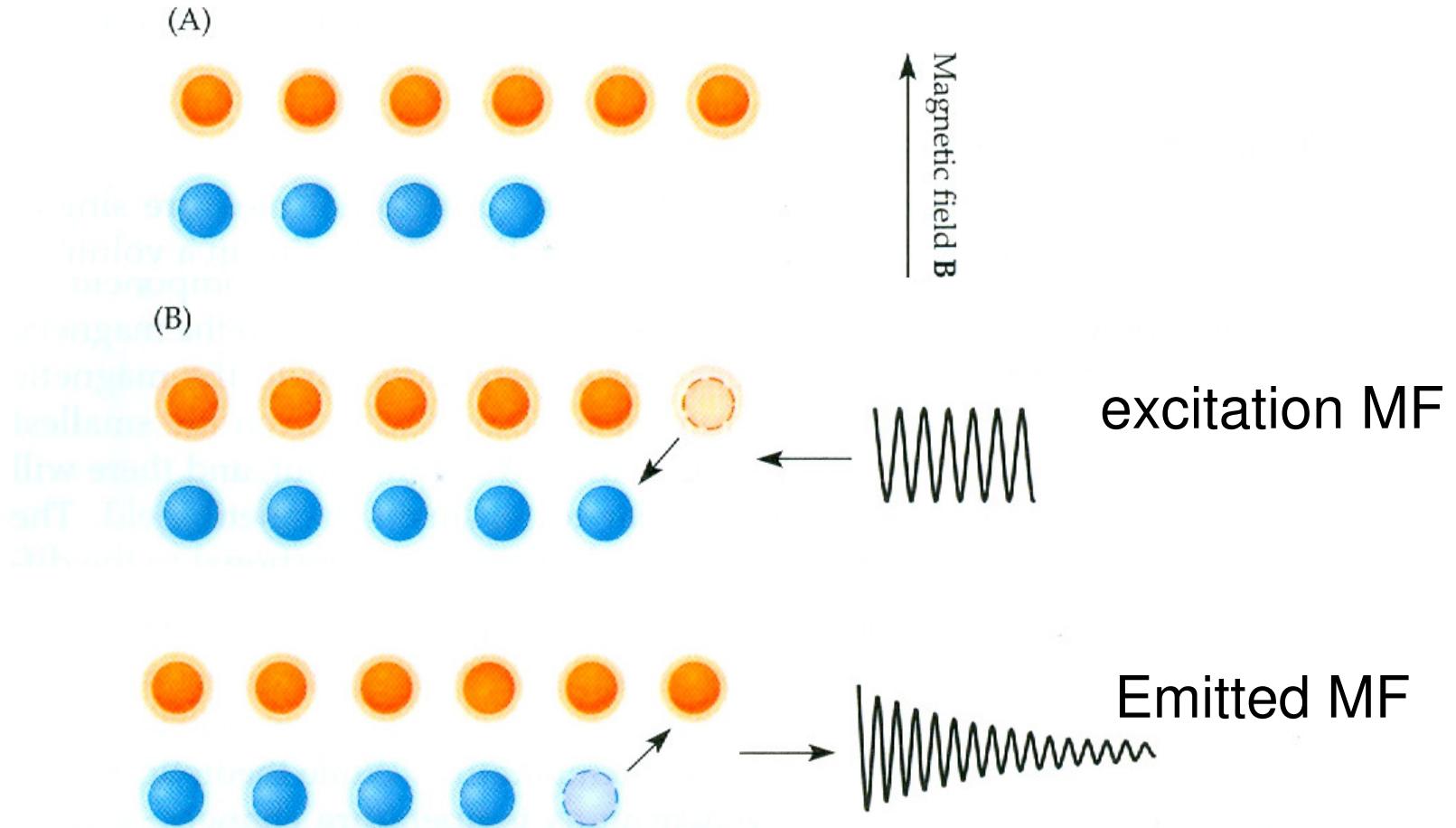
## Magnetic Resonance Imaging



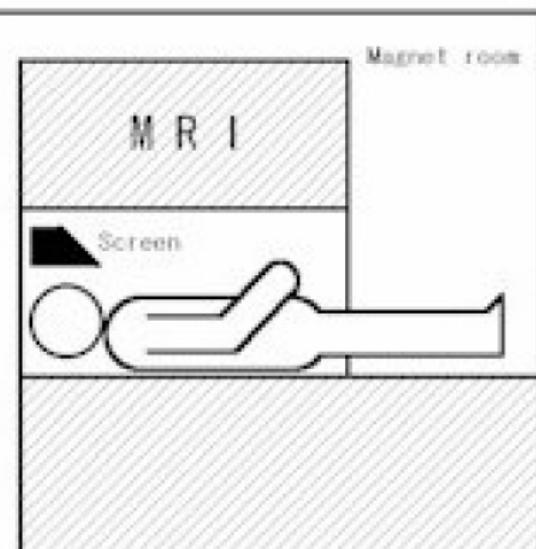
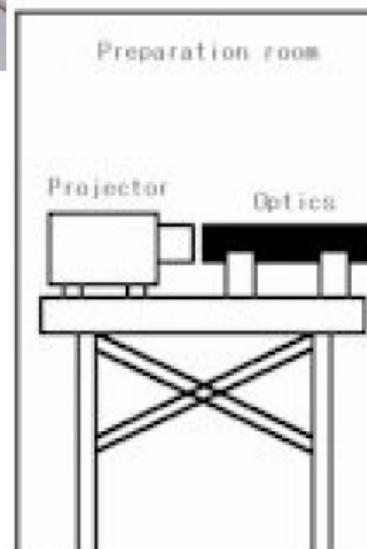
Scott A. Huettel • Allen W. Song • Gregory McCarthy

# fMRI physics and equipment

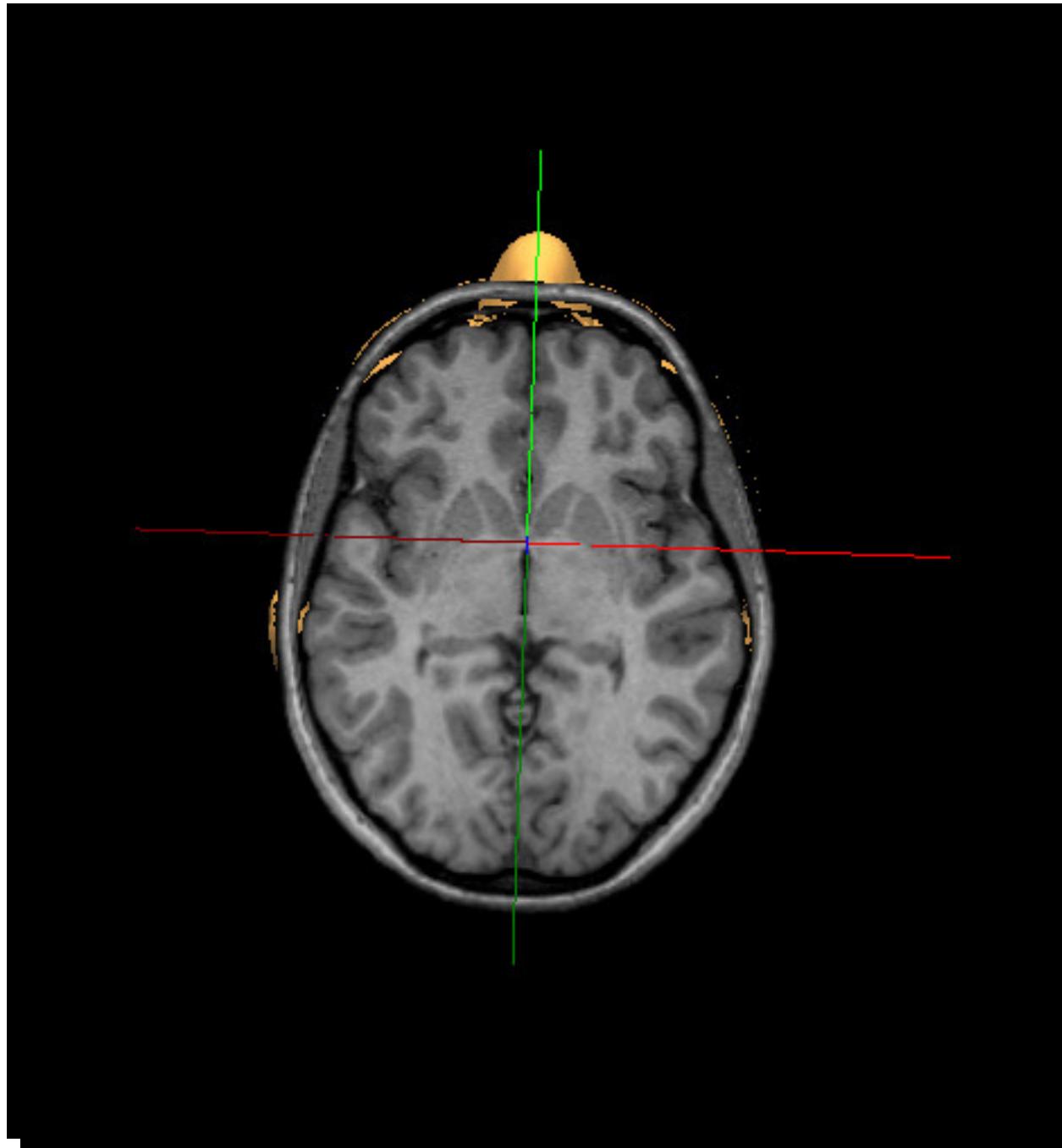


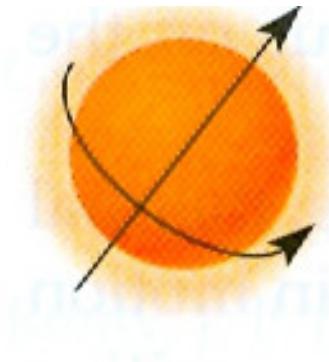
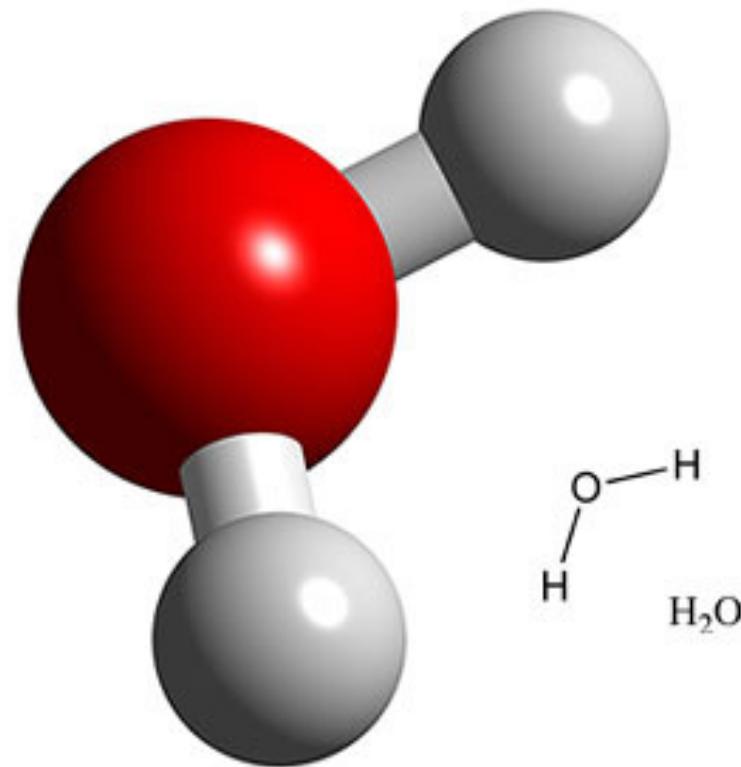


**Figure 3.9** Change between states due to absorption or transmission of energy. When spins are placed in an external magnetic field (A), more will be at the low-energy state (orange) than at the high-energy state (blue). If an excitation pulse with the right amount of energy is applied, some spins will absorb that energy and jump to the high-energy state (B). But after the excitation pulse is turned off, some of the spins in the high-energy state will return to the low-energy state, releasing the absorbed energy (C).



# **MRI –** structural information

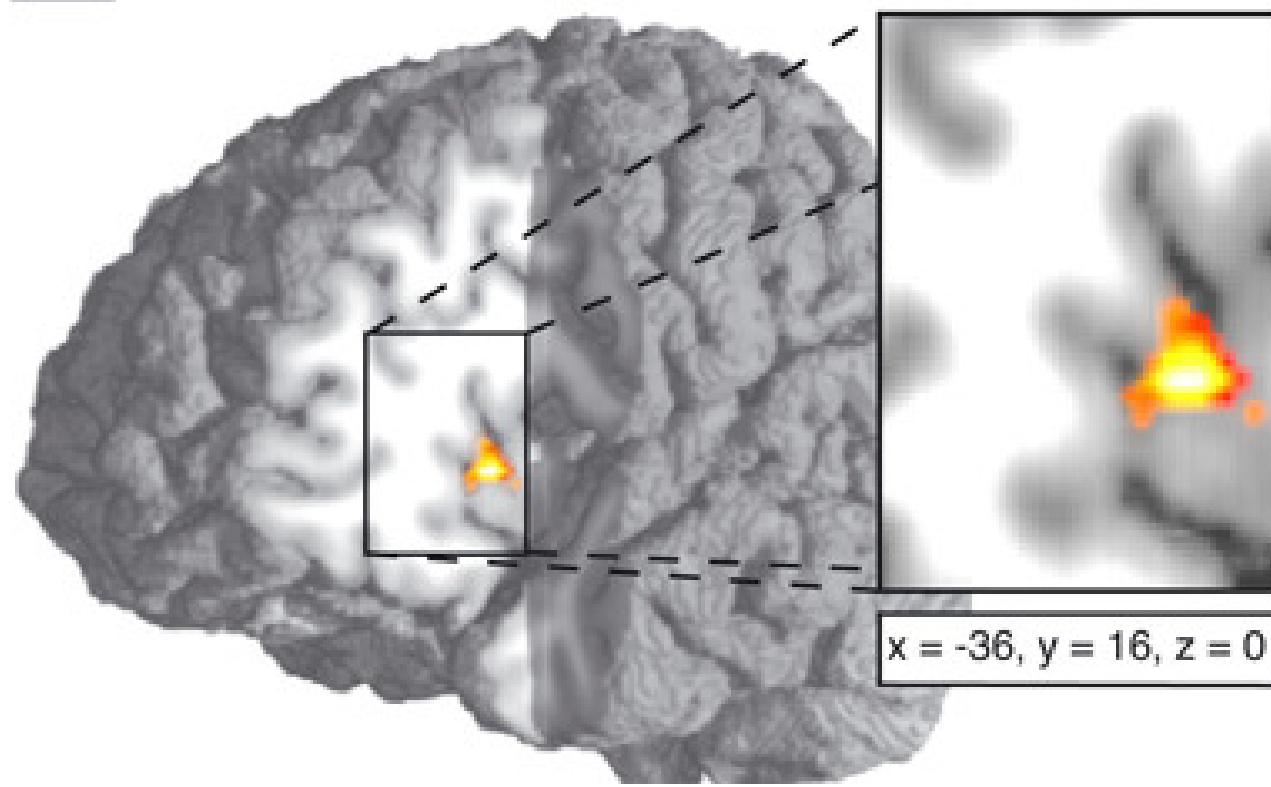


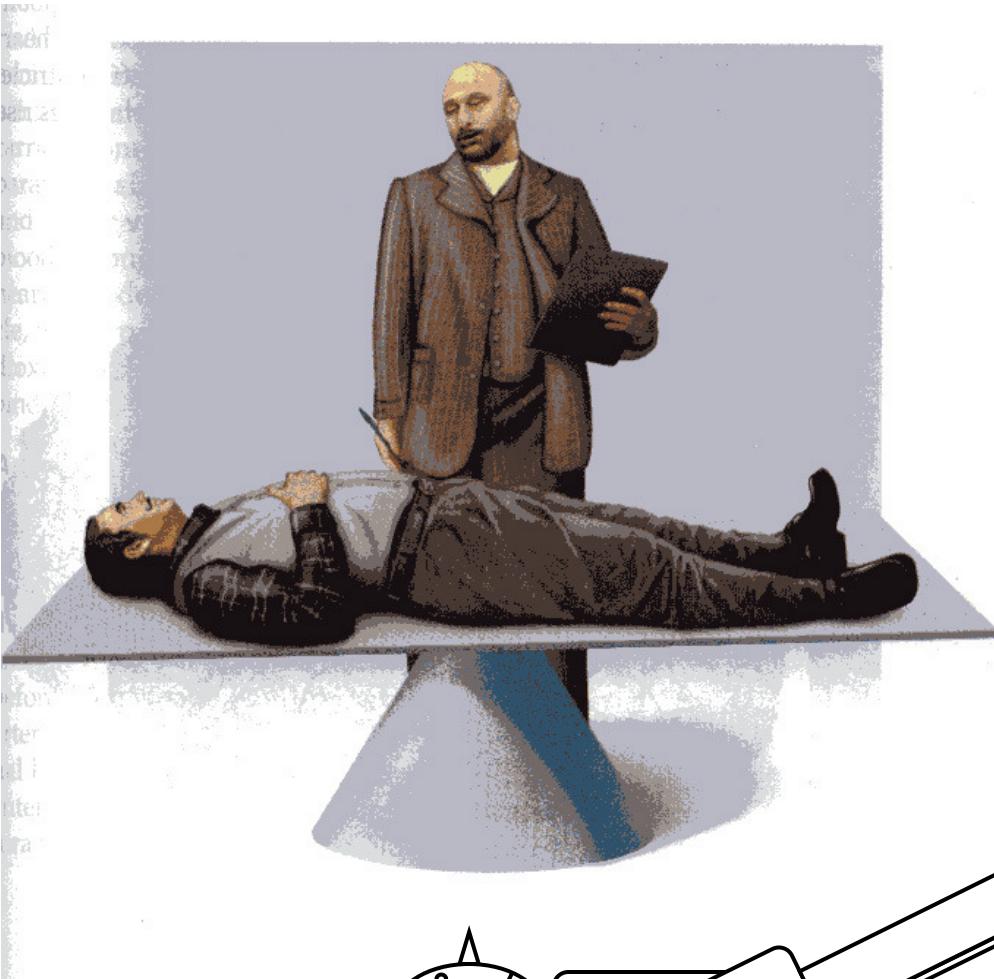


**Protons of hydrogen (in the molecule of water) show different magnetic characteristics depending on the chemical environment.**

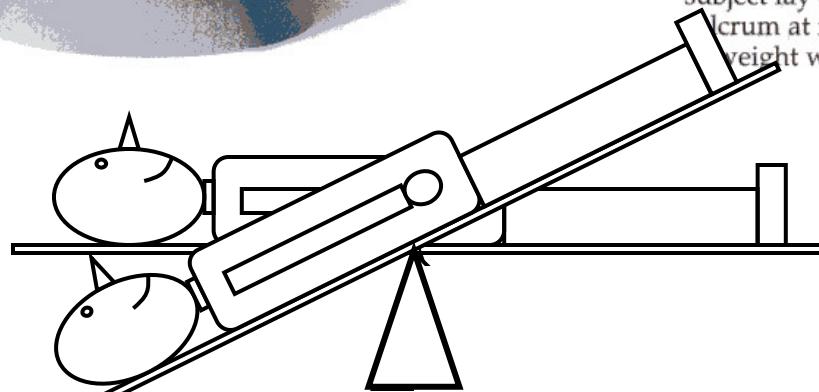


BBC  
**ONE**

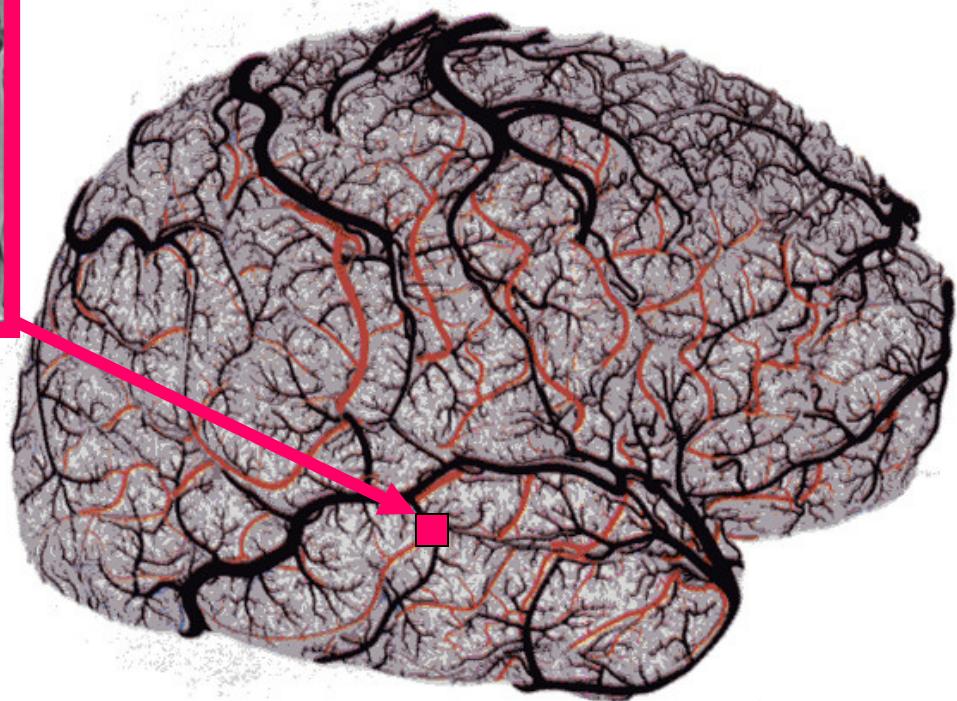




**Figure 6.7** The crude imaging apparatus used by Angelo Mosso in the late nineteenth century. Mosso theorized that thinking drew blood to the brain, and constructed a balance device to measure changes in weight associated with this increased blood flow. The subject lay down on a large table with a fulcrum at its center, so that any change in weight would cause the table to tip.

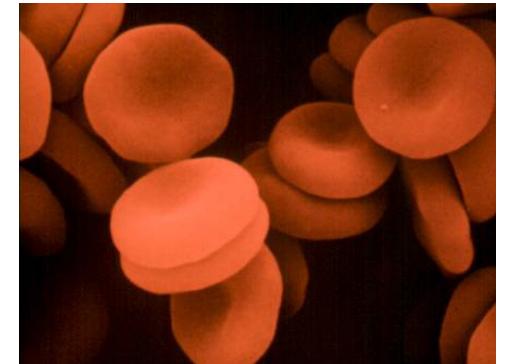


Activity of neurons triggers inflow of blood.

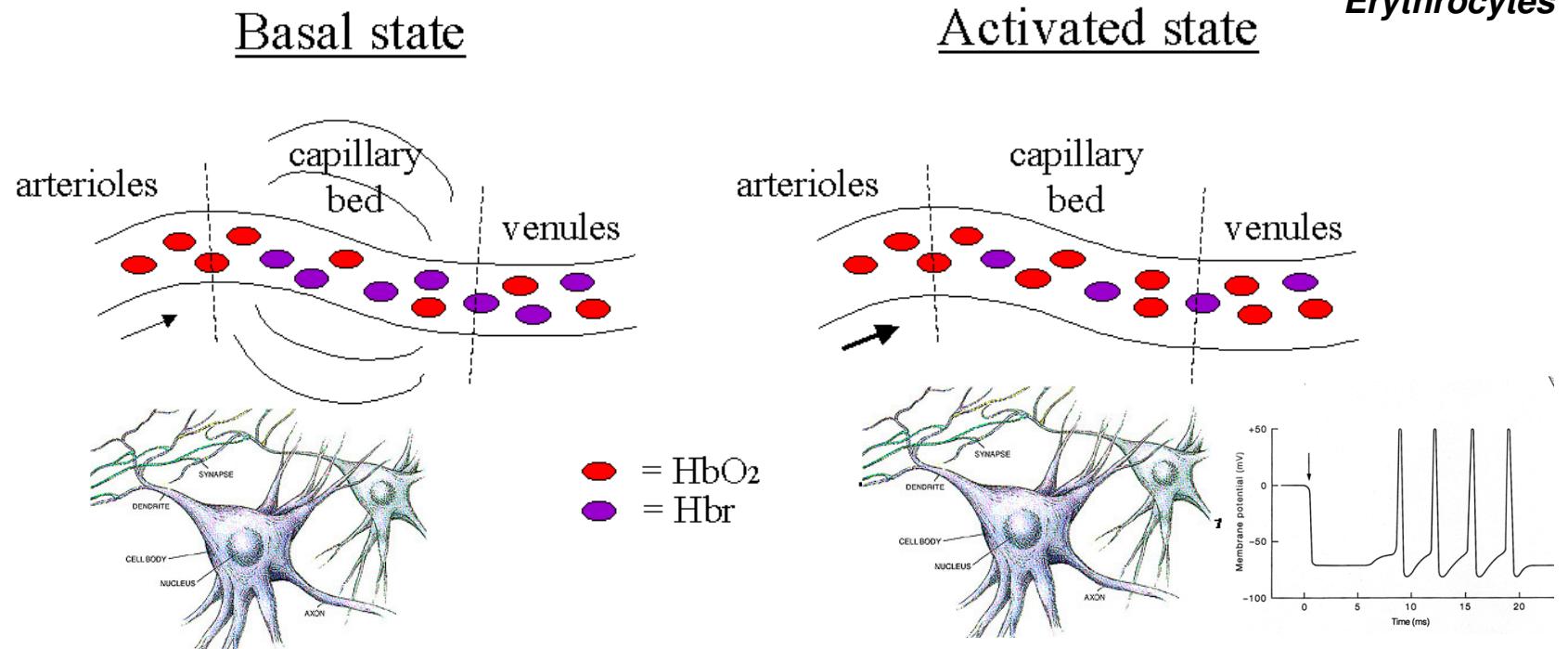


**Figure 6.8** Blood supply to the human cerebrum. As illustrated here, the surface pattern of blood supply to the human cerebrum is highly complex. The red vessels are tributaries of the middle cerebral artery, the green vessels are tributaries of the anterior cerebral artery, and the blue vessels are tributaries of the posterior cerebral artery. The veins are shown in black. (From Duvernoy, Delon, and Vannson, 1981.)

# Blood Oxygen Level-Dependent (BOLD) signal



Erythrocytes



When neurons are more active they consume oxygen that triggers originated blood inflow.

↑neural activity → ↑ blood flow → ↑ oxyhemoglobin → ↑ T<sub>2</sub>\* → ↑ MR signal

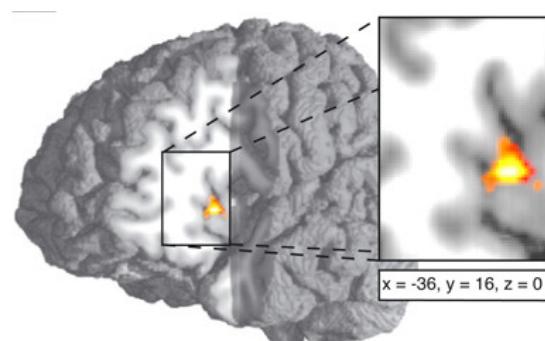
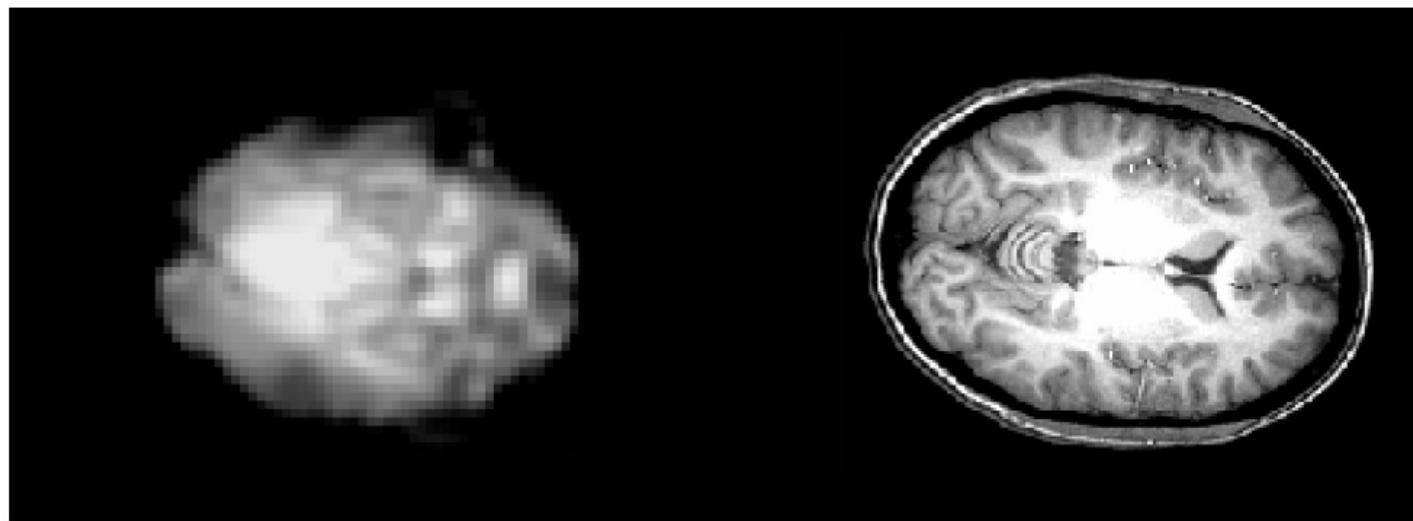
**Method 1**

**f**unctional **MRI**

**vs.**

**Method 2**

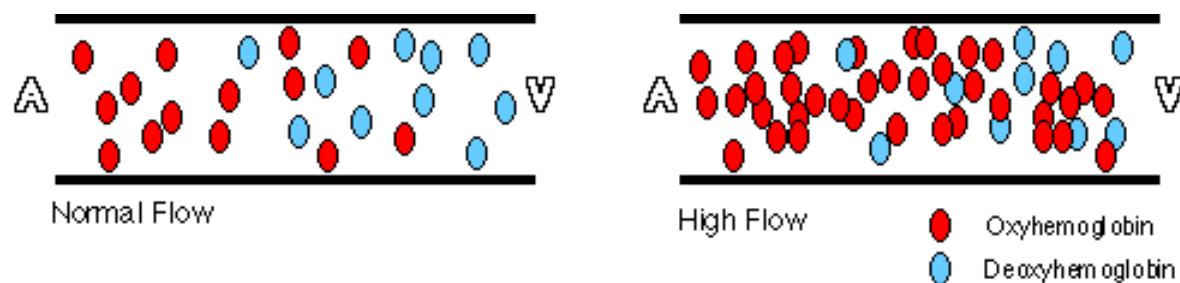
structural **MRI**



# BOLD (Blood Oxygen Level Dependent) contrast imaging

- Takes advantage of the different magnetic properties of oxyhemoglobin ( $\text{HbO}_2$ ) and deoxyhemoglobin (Hb)

Hb is paramagnetic and introduces an inhomogeneity into the nearby magnetic field, whereas  $\text{HbO}_2$  is weakly diamagnetic and has little effect.



neuronal activity



local blood flow increases overcompensating for  
oxygen consumption

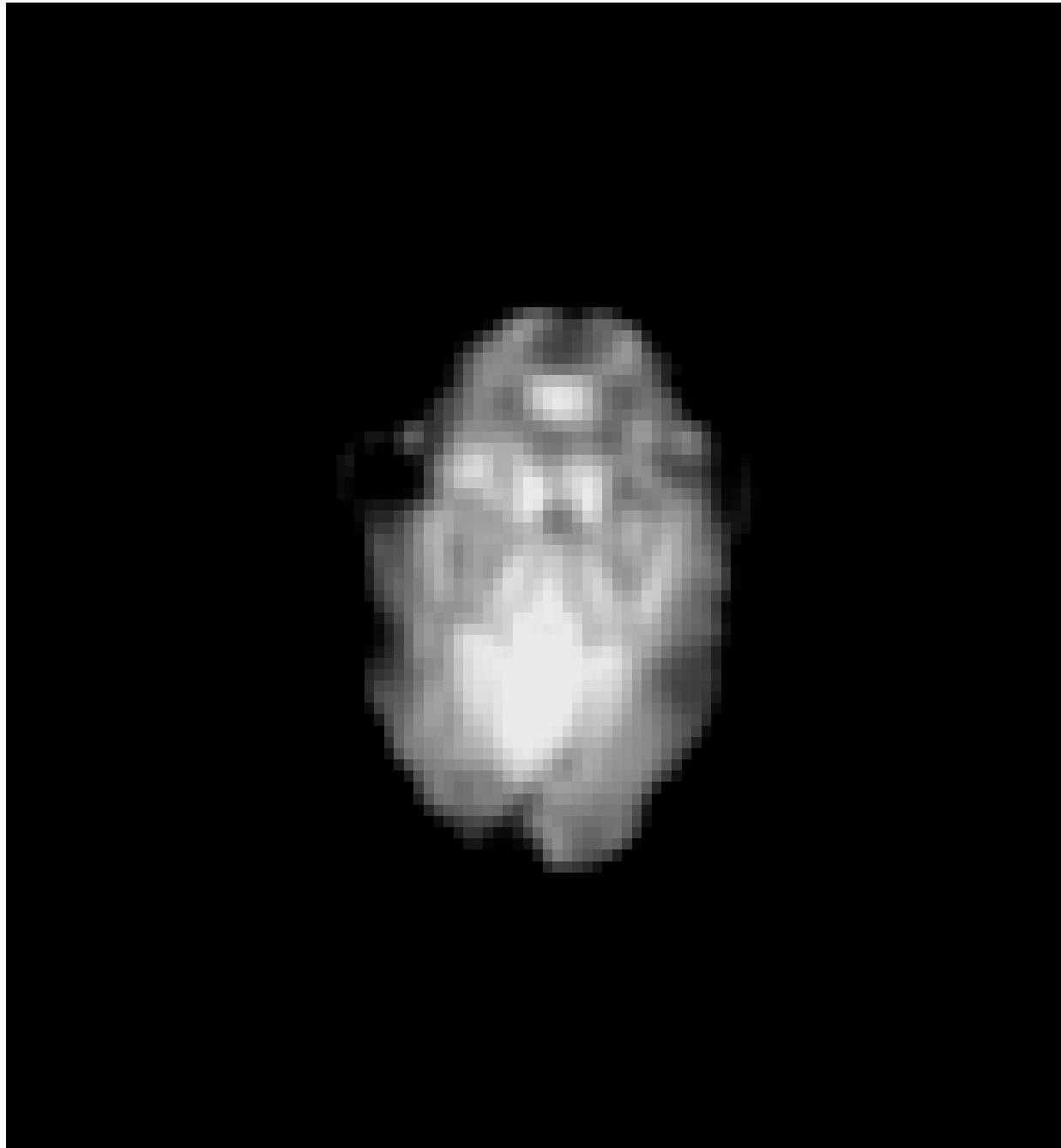


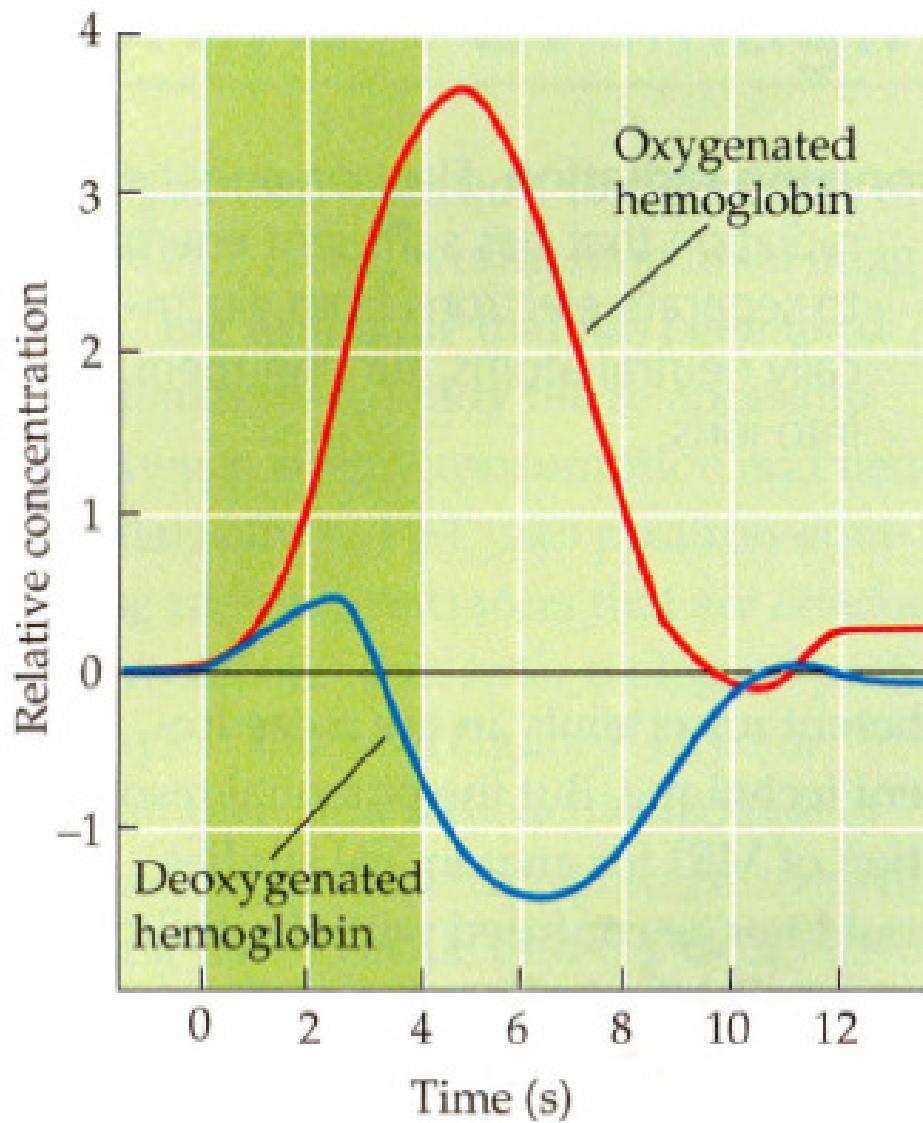
oxygen level in venous blood is elevated



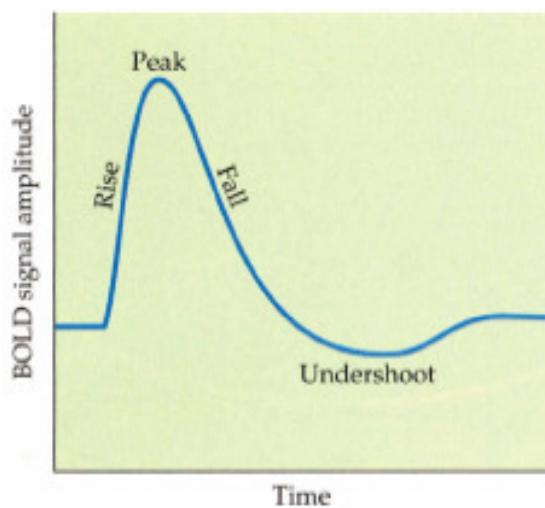
larger MR signal.

functional  
MRI

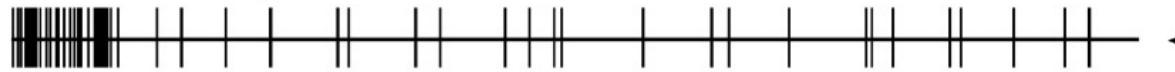




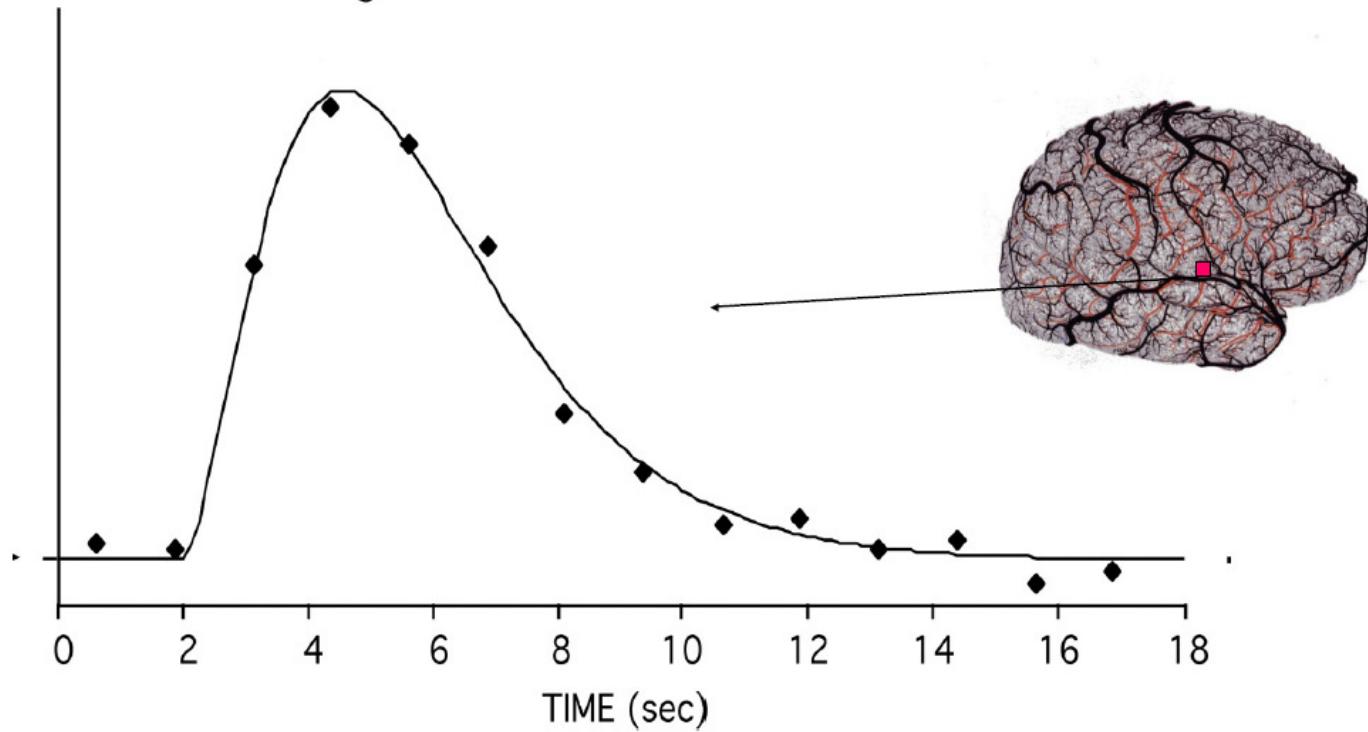
**Figure 7.5** Changes in oxygenated and deoxygenated hemoglobin following neuronal stimulation. This figure shows that the concentration of deoxygenated hemoglobin increases rapidly at stimulus onset, peaking at about 2 s, and then declines to a minimum value about 6 s after onset. The oxygenated hemoglobin signal shows no decline, but begins rising shortly after stimulus onset and reaches a peak at about 5 to 6 s, with a slow decline to about 10 s. (Data from Malonek and Grinvald, 1996.)



### Neural Activity



### Measured MRI Signal



- **The central assumption:** the fMRI signal is approximately proportional to some measure of the local neural activity, averaged over several millimeters and several seconds.

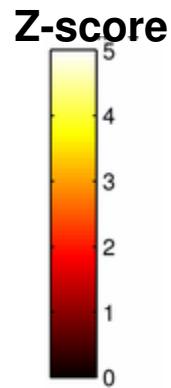
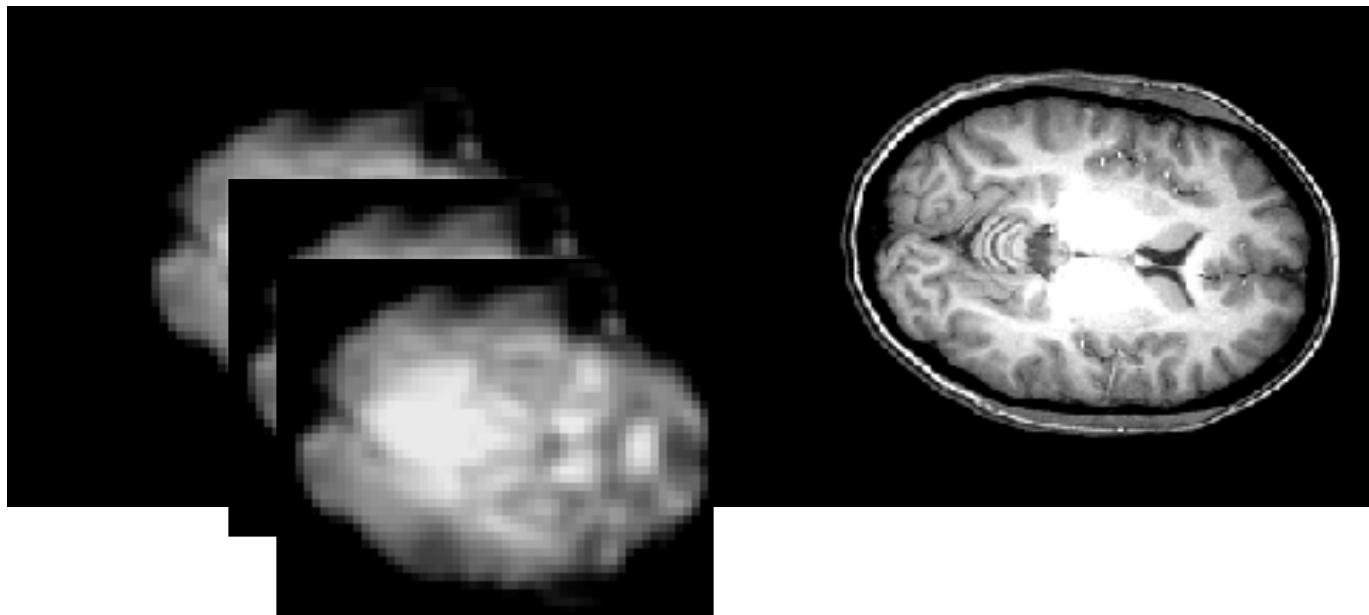
## Method 1

functional MRI

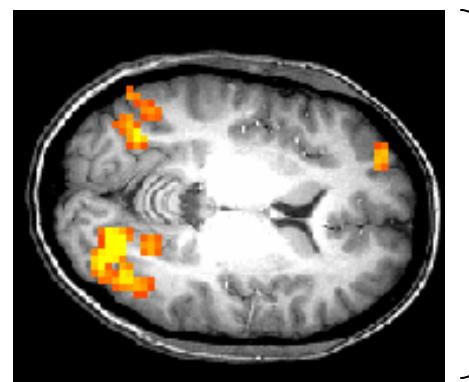
## Method 2

vs.

structural MRI

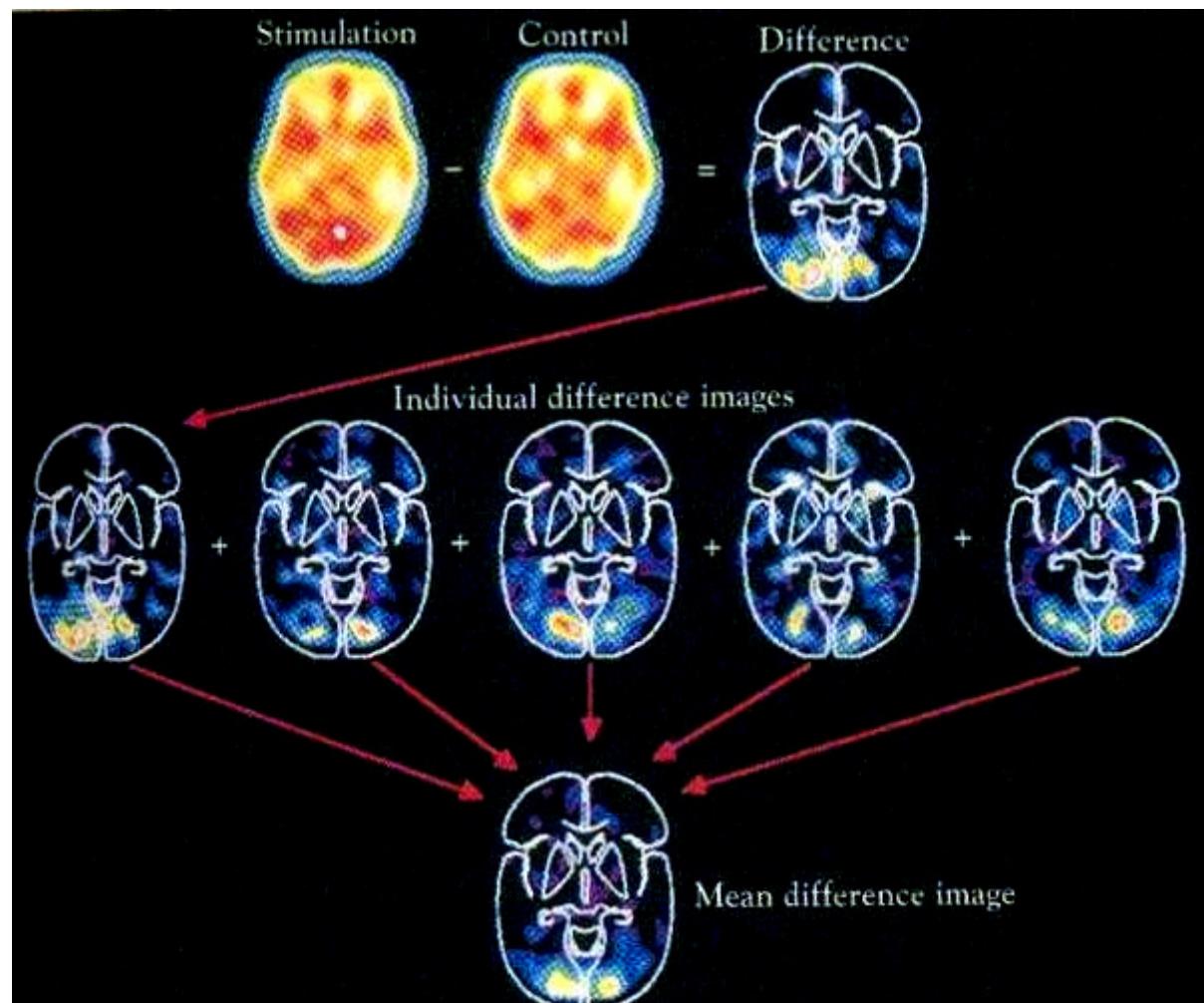


Statistical Map  
superimposed on  
anatomical MRI  
image



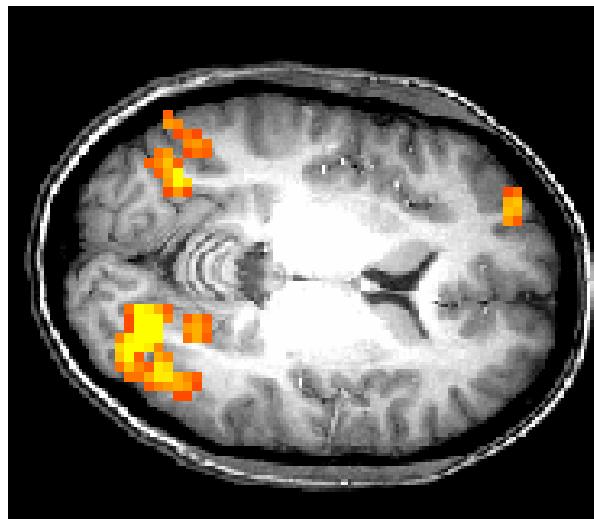
The result of a fMRI  
study is a  
combination of  
functional and  
structural MRIs

# Brain Activations

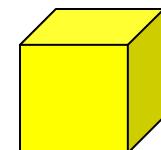
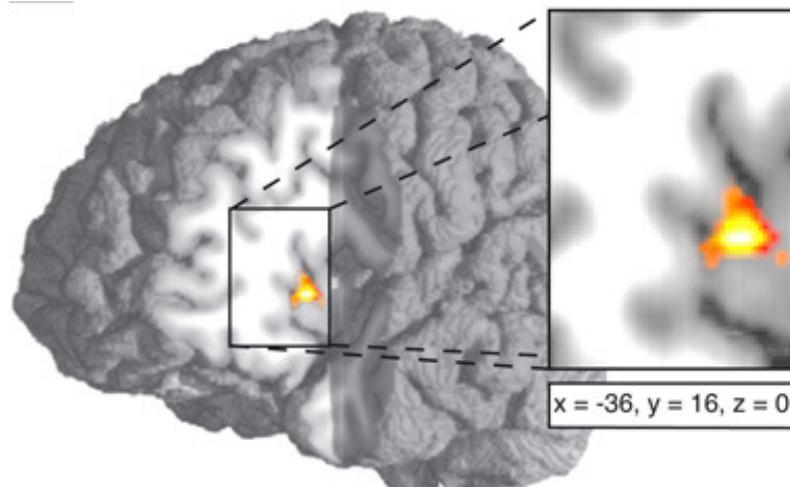


Source: Posner & Raichle, *Images of Mind*

**2-D**



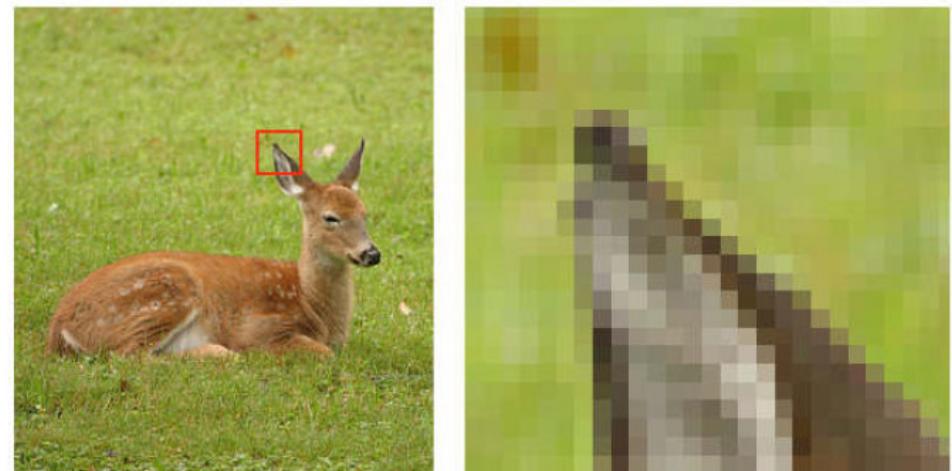
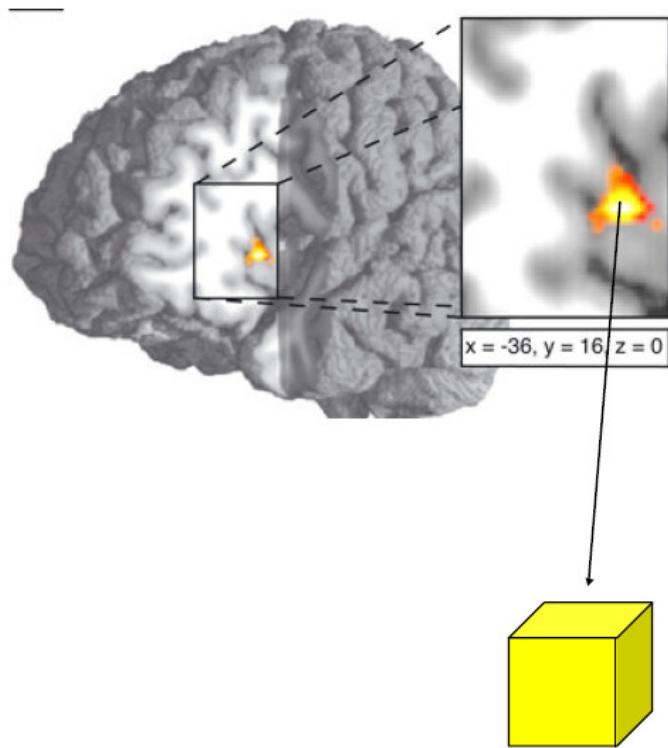
**3-D**



**Voxel – the  
smallest 3-D unit**

**Activation – a cluster of significant Voxels**

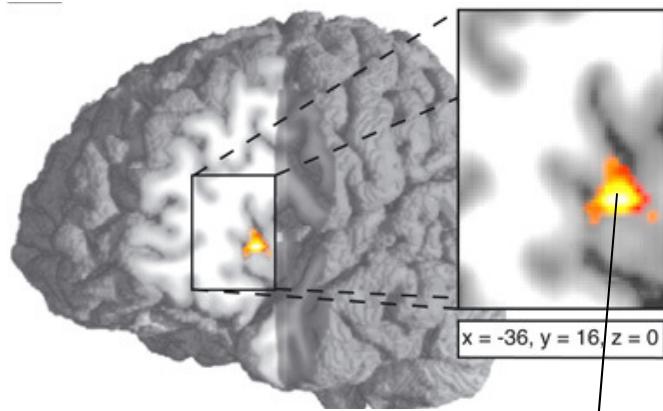
# Statistical Map



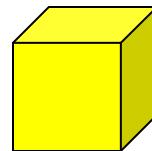
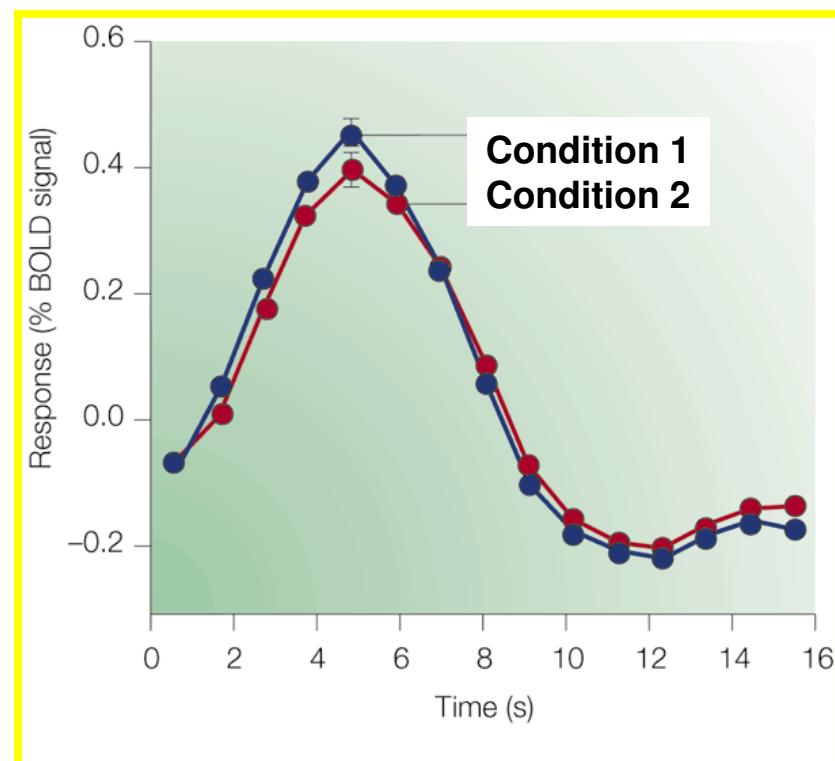
**Significant voxel**

**Pixel**

## Statistical Map



## BOLD response



**Significant voxel**

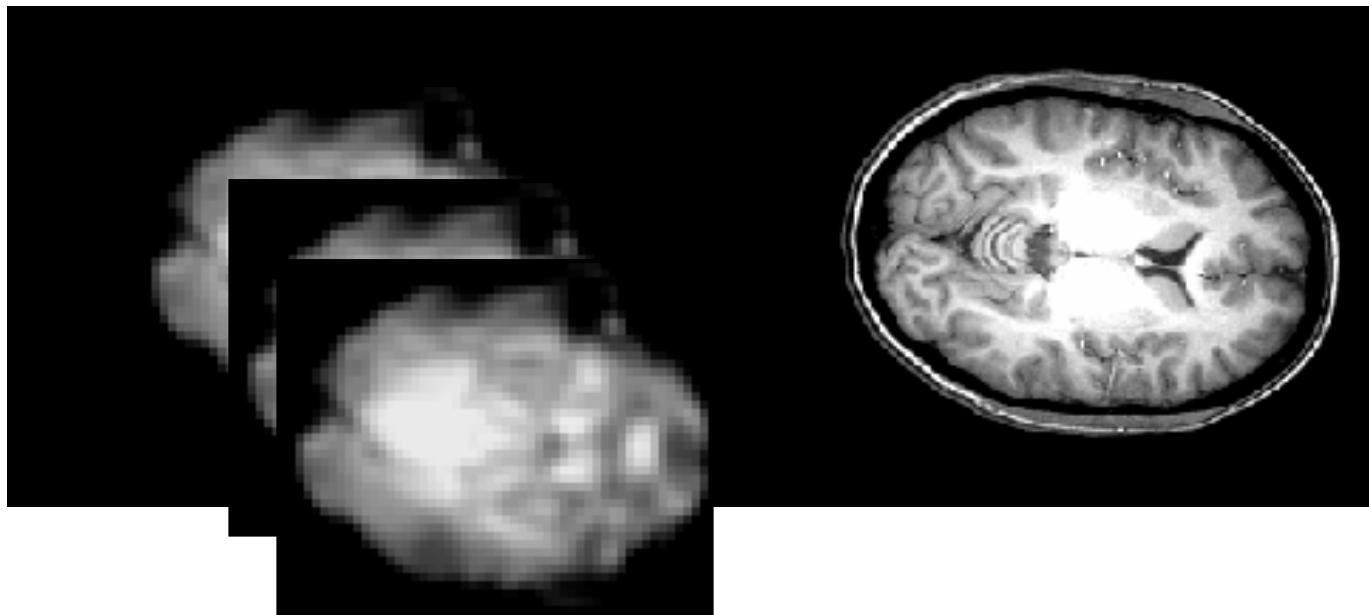
## Method 1

**f**unctional MRI

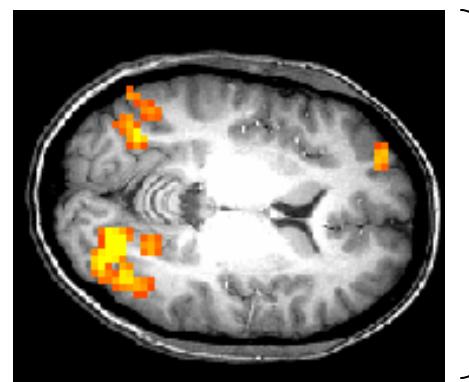
vs.

## Method 2

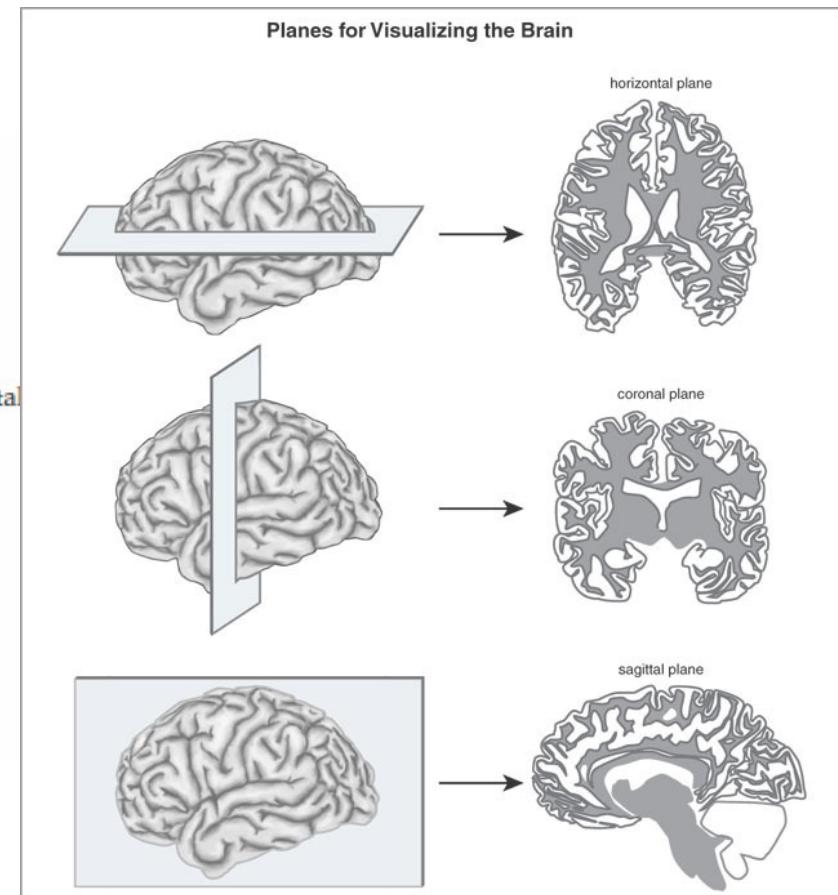
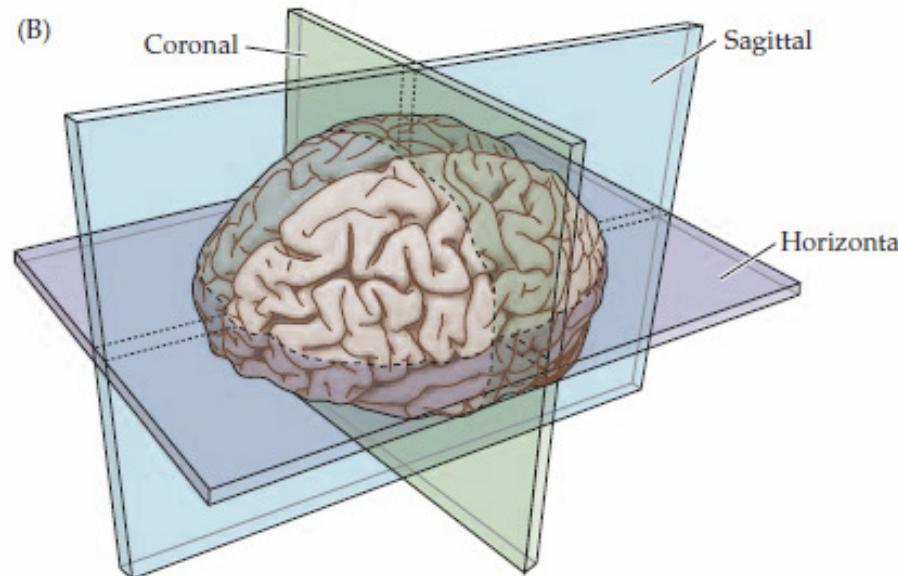
structural MRI



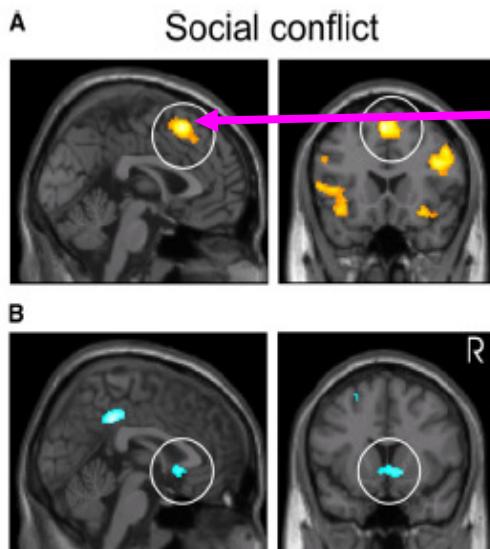
**Statistical Map  
superimposed on  
anatomical MRI  
image**



**The result of a fMRI  
study is a  
combination of  
(1) functional and  
(2) structural MRIs**



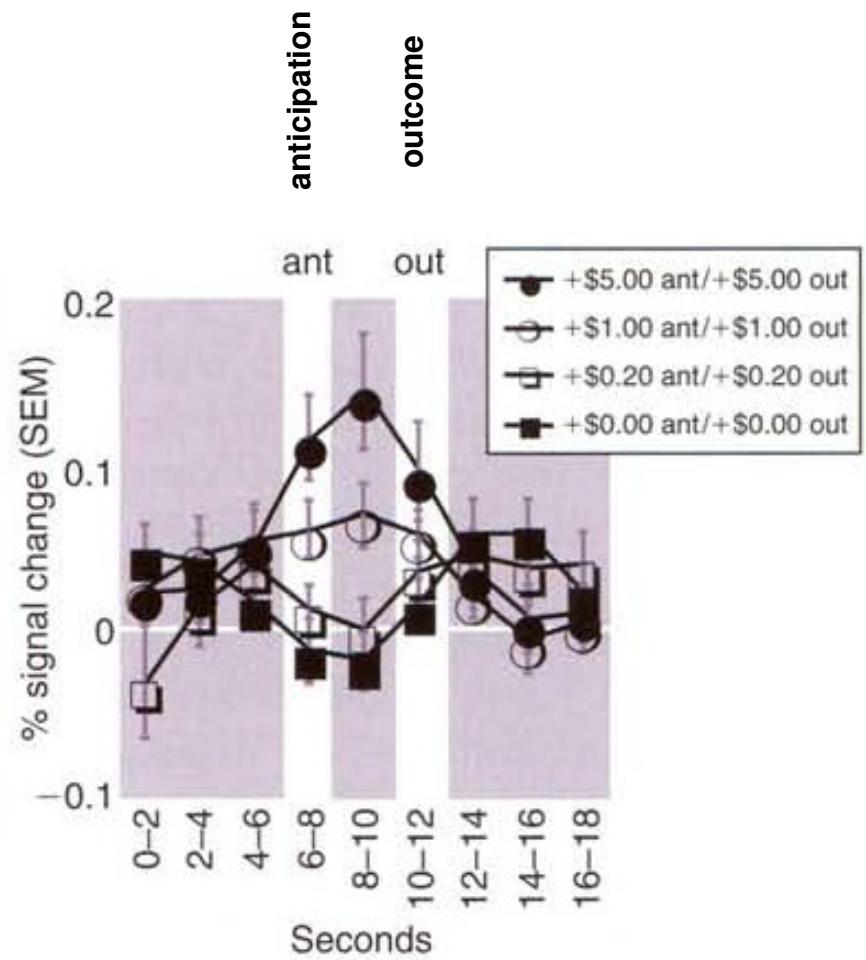
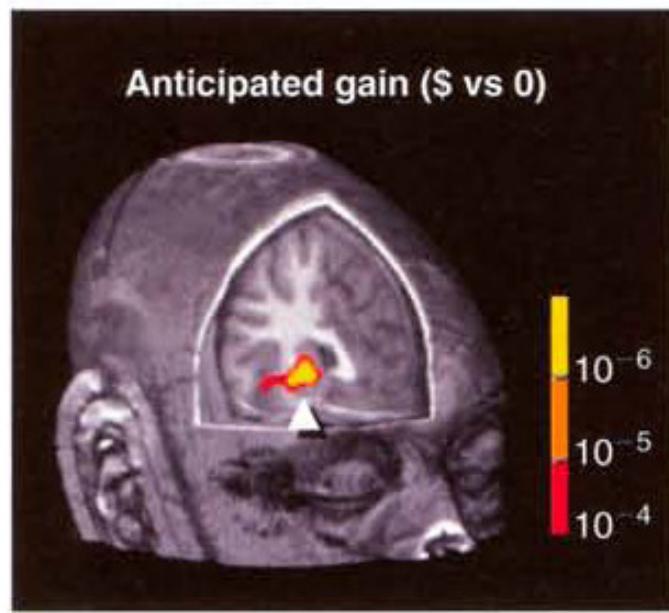
# Read fMRI results



1. Activation
2. Coordinate  
in 3-D space
3. Size in Voxels
4. Significance

**Table 1. Significant Activation Clusters for Social Conflict Contrast**

| Brain Region  | HEM | x   | y   | z   | No. of Voxels | Z     |
|---|-----|-----|-----|-----|---------------|-------|
| Activations   |     |     |     |     |               |       |
| Rostral cingulate zone (RCZ): medial/superior frontal gyrus, cingulate gyrus BA 6/8/24/32 | L/R | -3  | 14  | 48  | 591           | 5.26  |
| Precuneus, cuneus, BA 7/19  | L   | -20 | -69 | 37  | 233           | 3.94  |
| Precuneus, BA7/19   | R   | 12  | -75 | 45  | 989           | 4.97  |
| Middle frontal gyrus, BA9   | L   | -36 | -3  | 37  | 666           | 4.61  |
| Middle frontal gyrus, BA9   | R   | 36  | 14  | 23  | 844           | 4.87  |
| Cerebellum  | L   | -34 | -58 | -28 | 357           | 4.30  |
| Insula, BA13  | L   | -41 | 18  | 4   | 276           | 4.22  |
| Insula, BA13  | R   | 27  | 16  | 13  | 149           | 3.92  |
| Middle frontal gyrus, precentral gyrus, BA 6  | R   | 29  | -3  | 51  | 149           | 4.19  |
| Midbrain  | R   | 10  | -21 | -14 | 52            | 3.66* |
| Midbrain  | L   | -3  | -15 | -3  | 27            | 3.55* |
| Midbrain  | L/R | 3   | -27 | -3  | 32            | 3.55* |



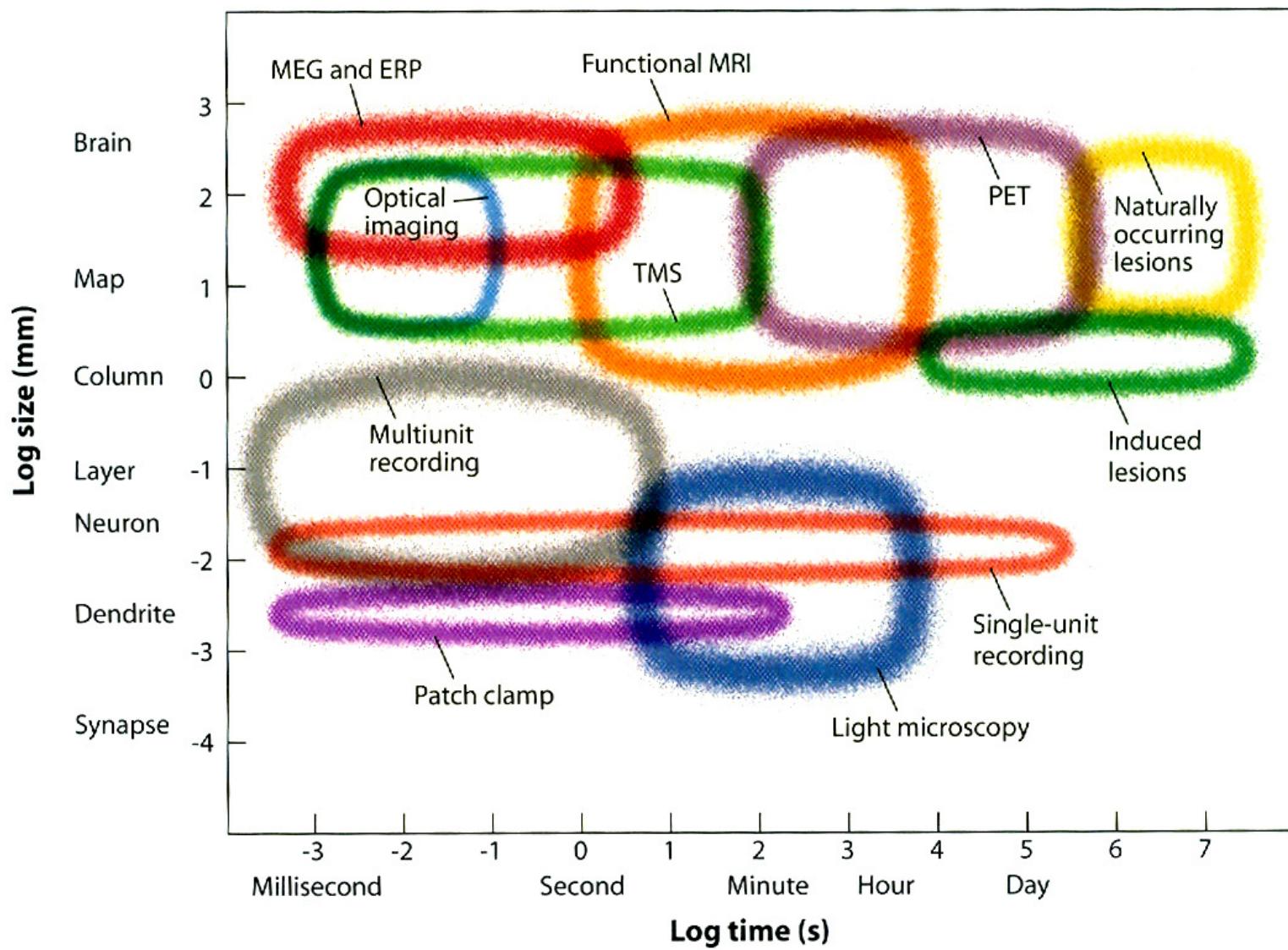
Anticipation of monetary gains of increasing magnitude elicits proportionally increasing NAcc activation.

**Activity of the ventral striatum related to the expected magnitude of the monetary outcome**

# Advantages vs. disadvantages

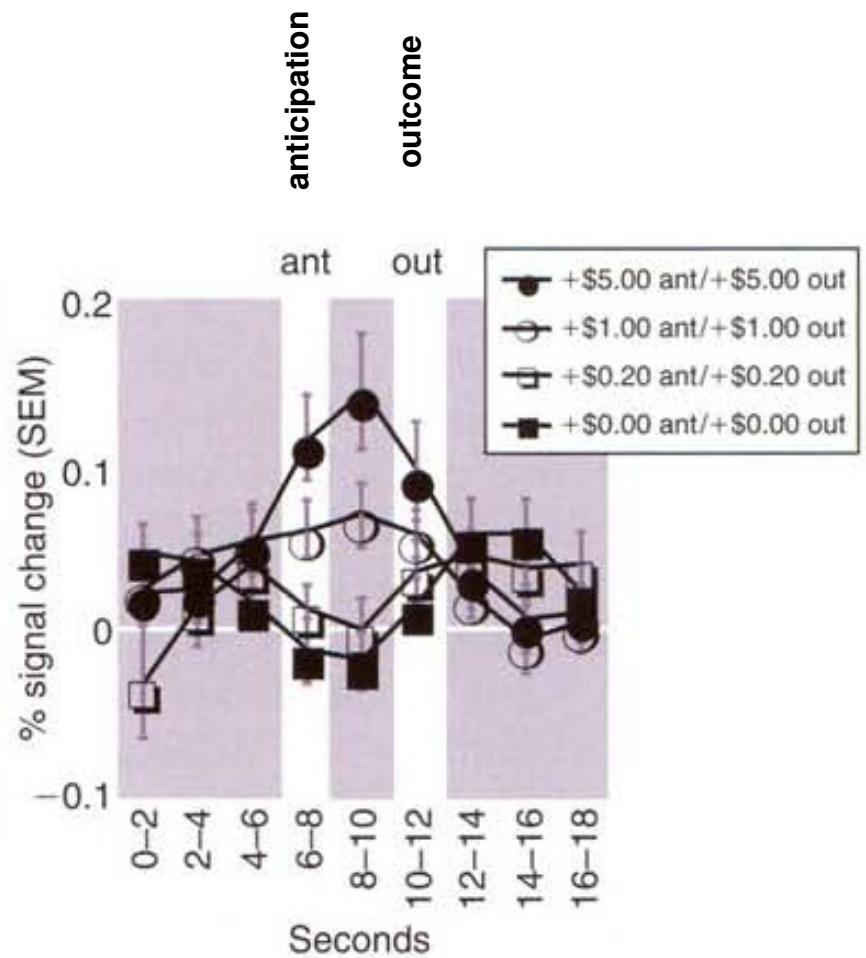
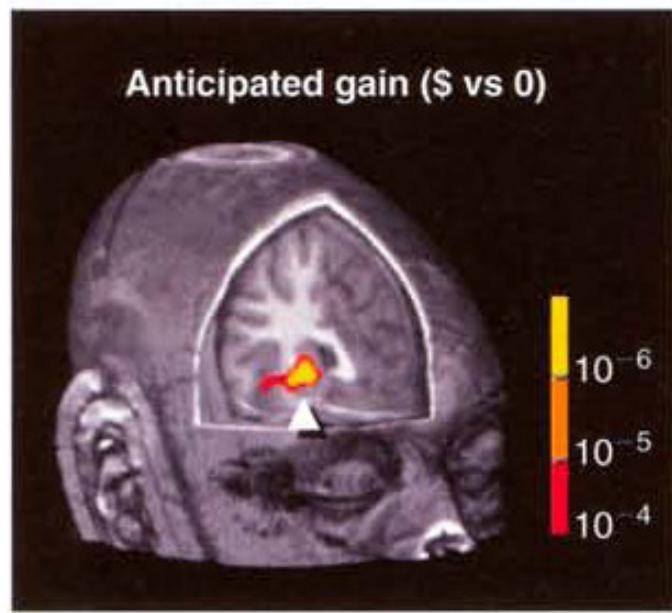
- Noninvasive
- Good 3D resolution
- Indirect (measures BOLD response)
- Bad timing (few seconds time resolution)
- Noisy
- Has restrictions for subjects

# Neuroscience methods



# General limitations of brain imaging studies

- Many trials for every experimental condition
- Need proper statistics
- Require group statistics
- Different time/spatial resolution
- Require laboratory environment



Anticipation of monetary gains of increasing magnitude elicits proportionally increasing NAcc activation.

**Activity of the ventral striatum related to the expected magnitude of the monetary outcome**