

# Neuroimaging and mathematical modelling

## Lesson 6: functional MRI

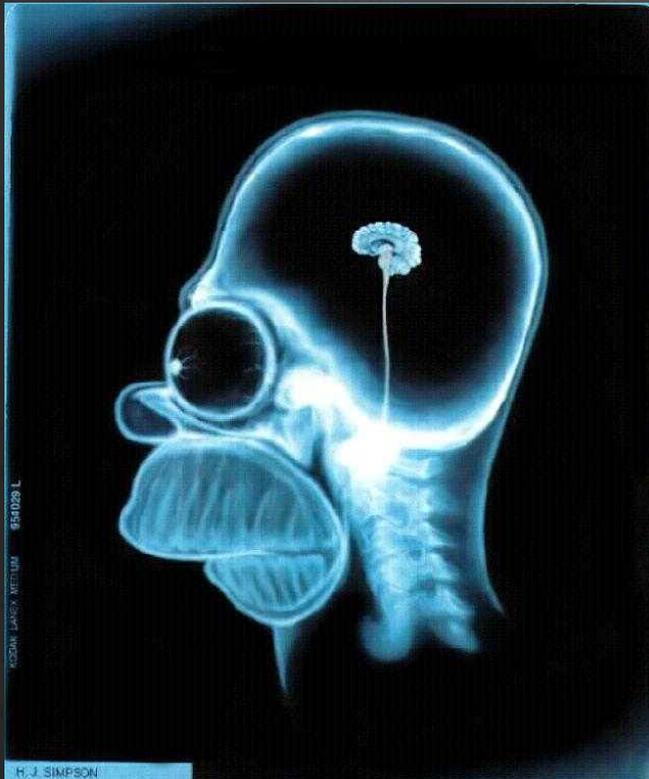
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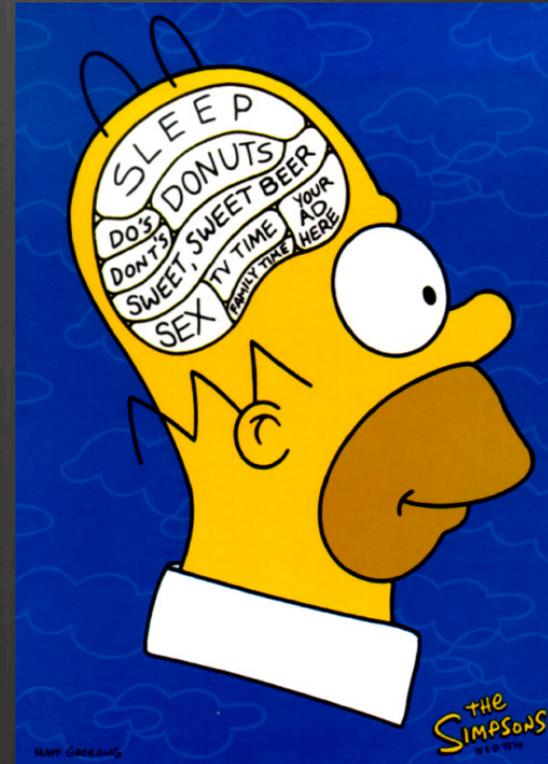
[Nivedita.agarwal@unitn.it](mailto:Nivedita.agarwal@unitn.it)

# MRI vs. fMRI

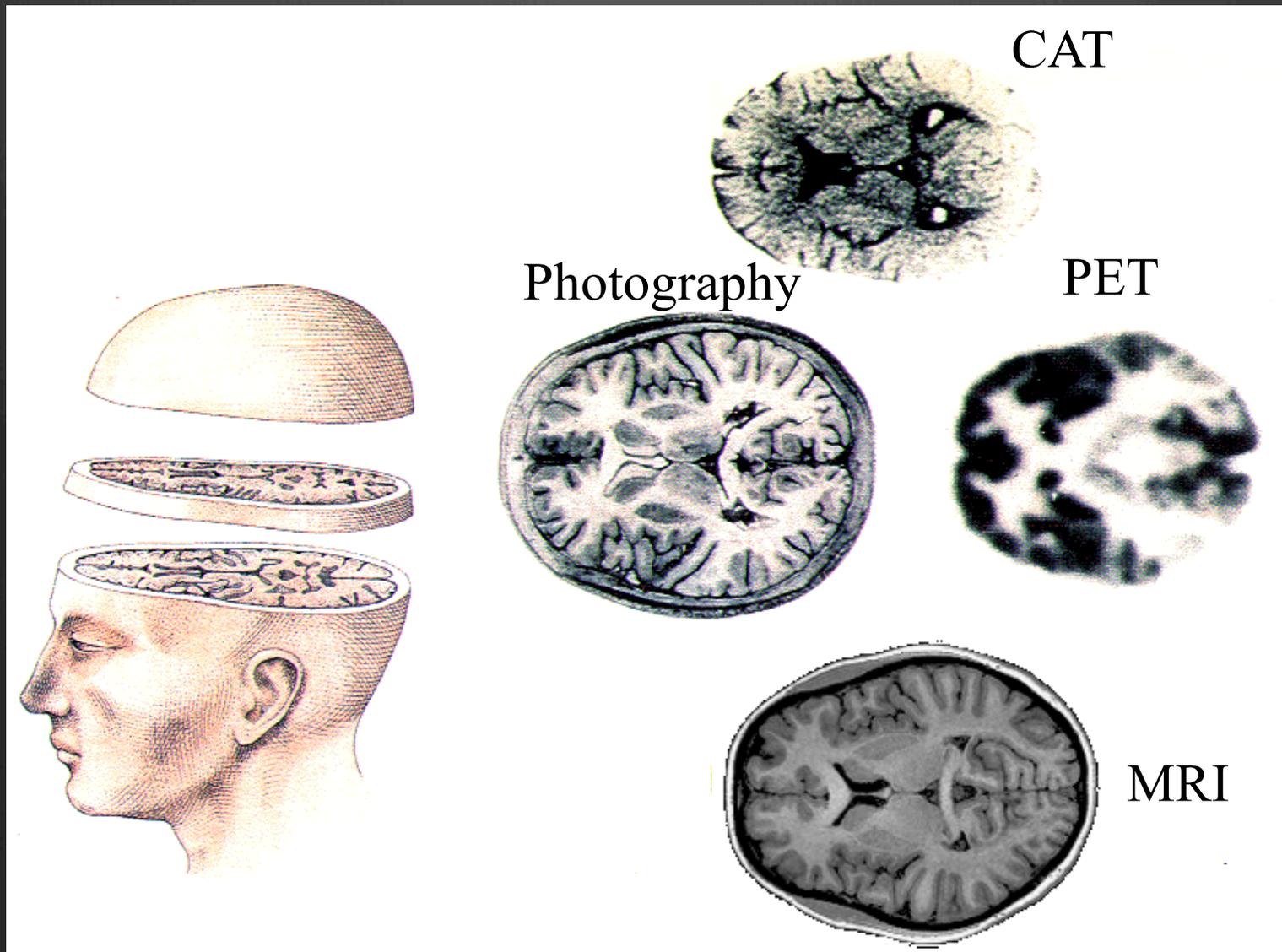
MRI studies brain anatomy.



Functional MRI (fMRI) studies brain function.



# Brain Imaging: Anatomy

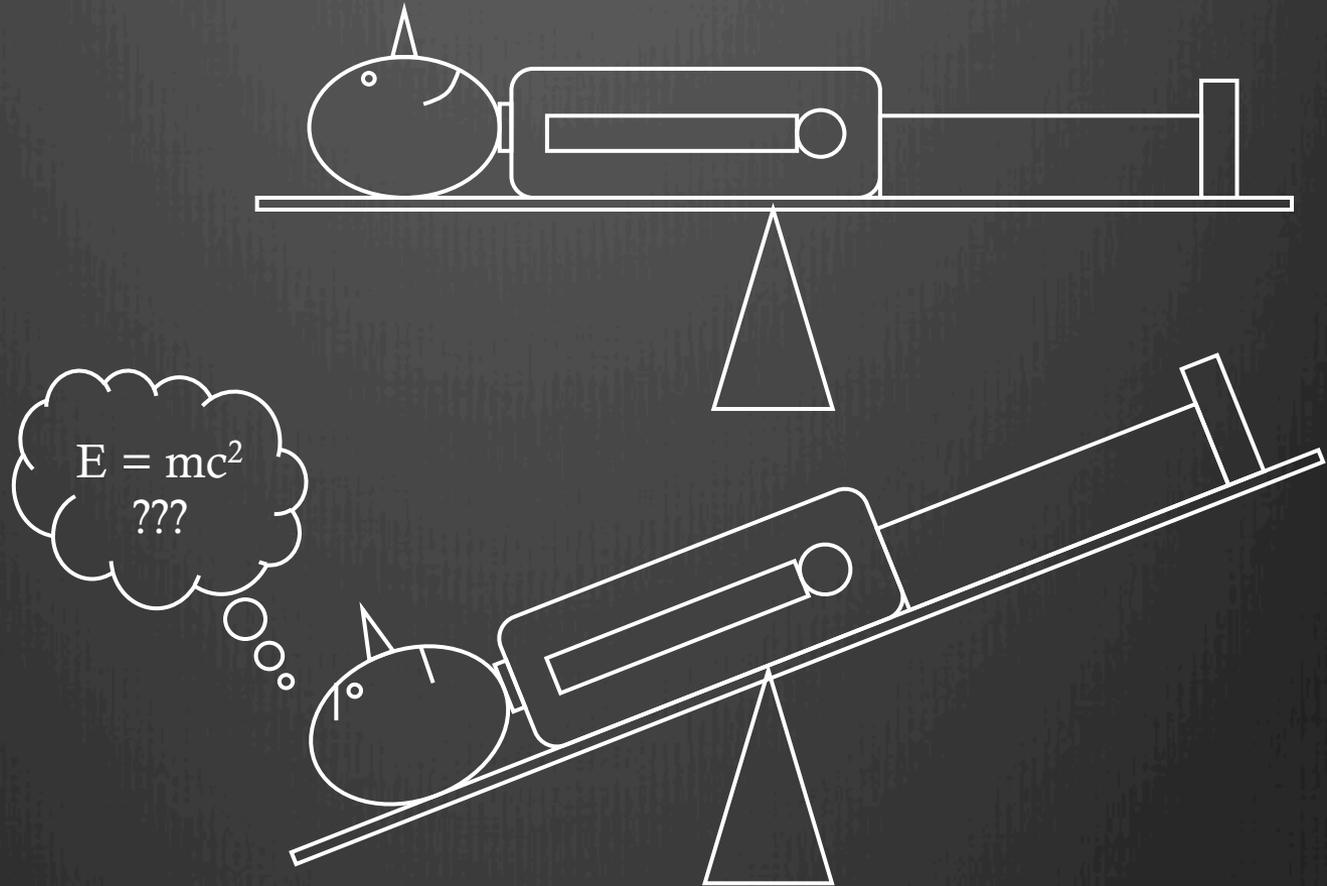


# The First “Brain Imaging Experiment”

... and probably the cheapest one too!



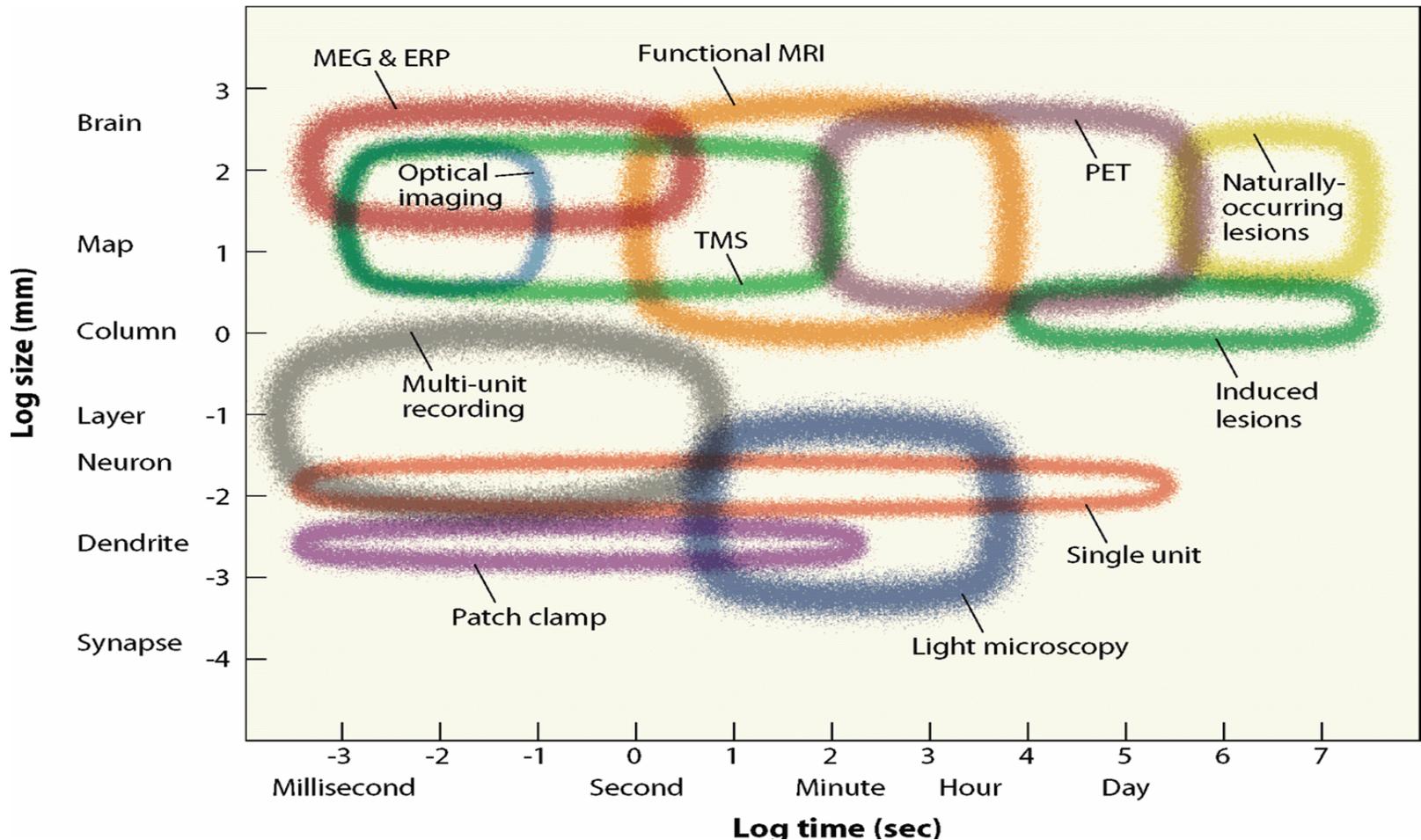
Angelo Mosso  
Italian physiologist  
(1846-1910)



“[In Mosso’s experiments] the subject to be observed lay on a delicately balanced table which could tip downward either at the head or at the foot if the weight of either end were increased. The moment emotional or intellectual activity began in the subject, down went the balance at the head-end, in consequence of the redistribution of blood in his system.”

-- William James, *Principles of Psychology* (1890)

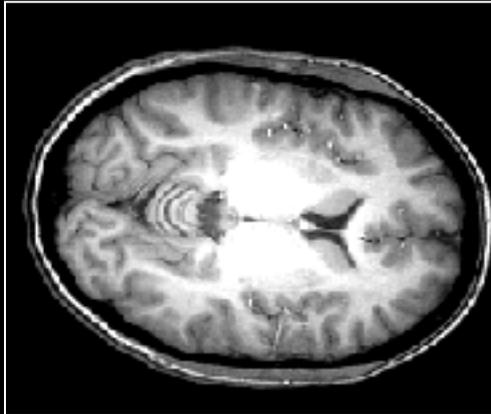
# Spatial and Temporal Resolution



# MRI vs. fMRI

high resolution  
(1 mm)

MRI

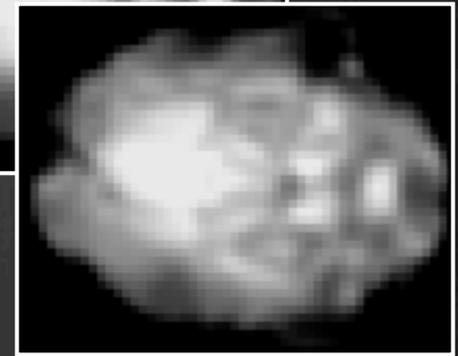
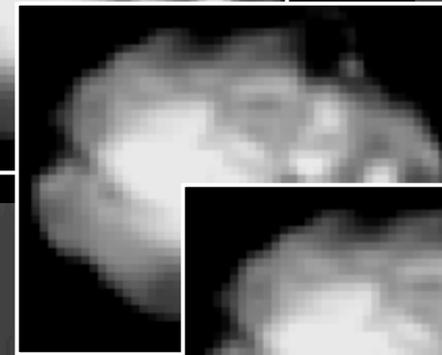


one image

fMRI



low resolution  
(~3 mm but can be better)



...

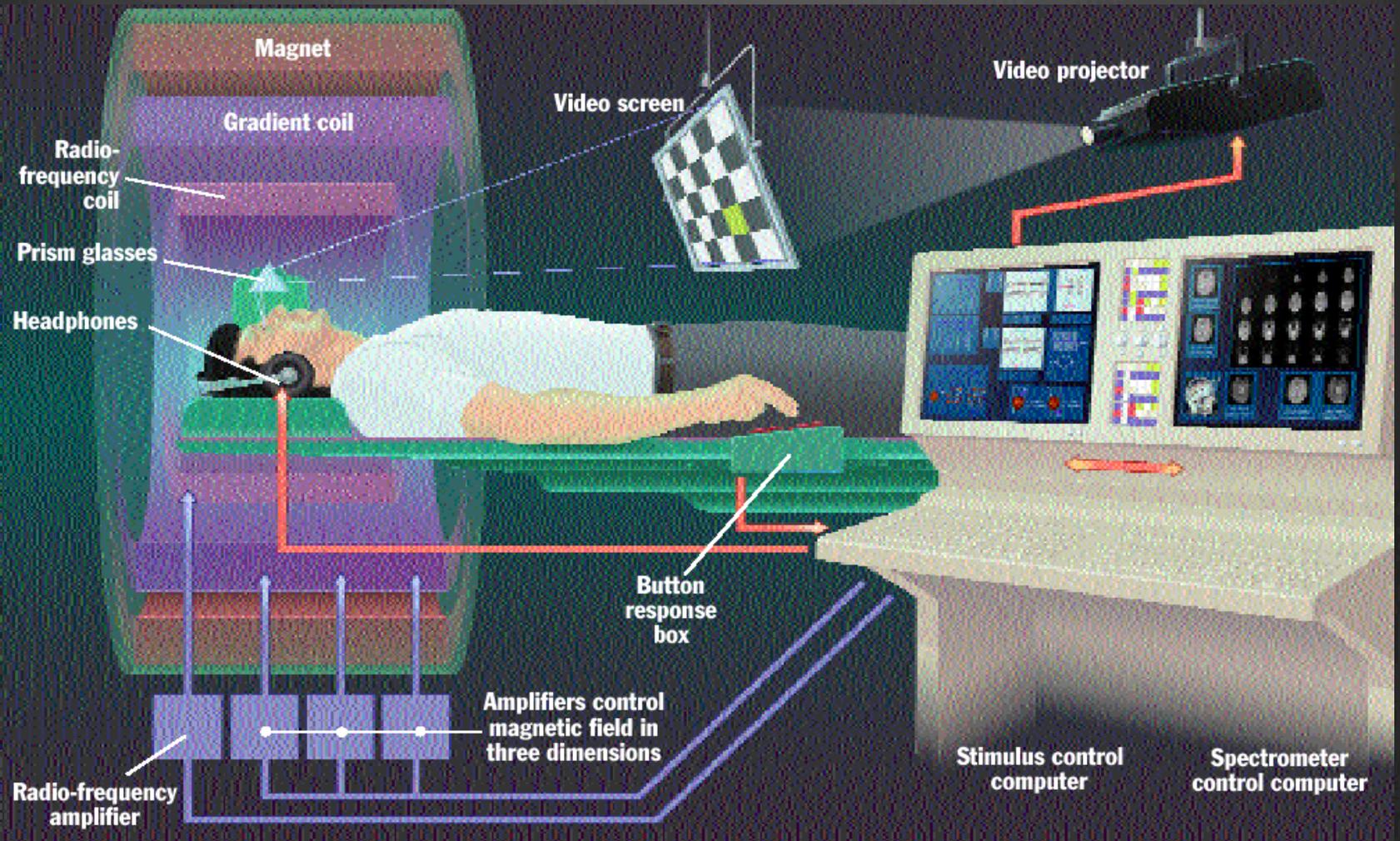
many images  
(e.g., every 2 sec for 5 mins)

fMRI

Blood Oxygenation Level Dependent (BOLD) signal  
indirect measure of neural activity

↑ neural activity → ↑ blood oxygen → ↑ fMRI signal

# fMRI Setup



# History of fMRI

## MRI

- 1971: MRI Tumor detection (Damadian)
- 1973: Lauterbur suggests NMR could be used to form images
- 1977: clinical MRI scanner patented
- 1977: Mansfield proposes echo-planar imaging (EPI) to acquire images faster

## fMRI

- 1990: Ogawa observes BOLD effect with  $T2^*$   
blood vessels became more visible as blood oxygen decreased
- 1991: Belliveau observes first functional images using a contrast agent
- 1992: Ogawa et al. and Kwong et al. publish first functional images using BOLD signal



*Ogawa*

## Brain magnetic resonance imaging with contrast dependent on blood oxygenation

(cerebral blood flow/brain metabolism/oxygenation)

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Biophysics Research Department, AT&T Bell Laboratories, Murray Hill, NJ 07974

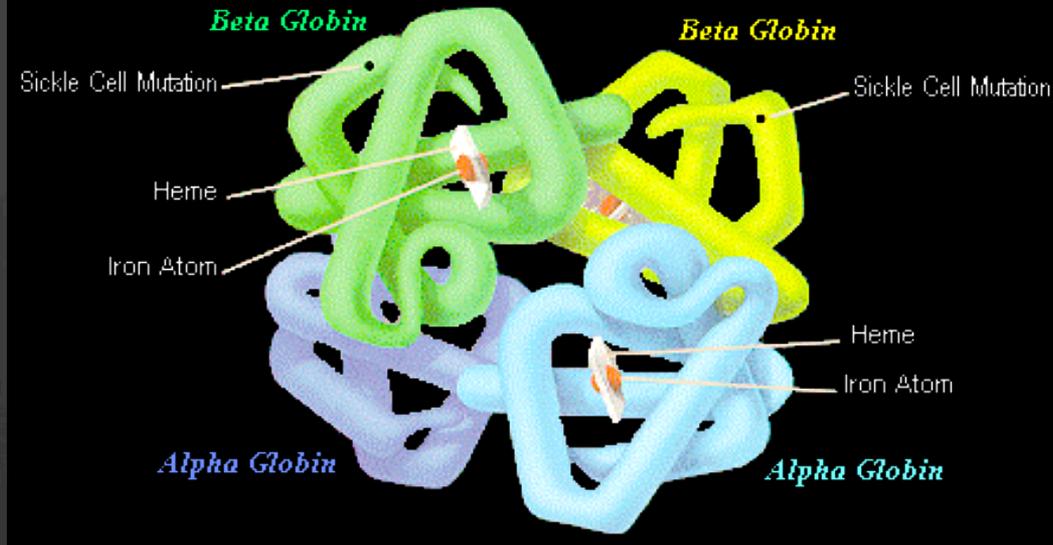


**ABSTRACT** Paramagnetic deoxyhemoglobin in venous blood is a naturally occurring contrast agent for magnetic resonance imaging (MRI). By accentuating the effects of this agent through the use of gradient-echo techniques in high fields, we demonstrate *in vivo* images of brain microvasculature with image contrast reflecting the blood oxygen level. This blood oxygenation level-dependent (BOLD) contrast follows blood oxygen changes induced by anesthetics, by insulin-induced hypoglycemia, and by inhaled gas mixtures that alter metabolic demand or blood flow. The results suggest that BOLD contrast can be used to provide *in vivo* real-time maps of blood oxygenation in the brain under normal physiological conditions. BOLD contrast adds an additional feature to magnetic resonance imaging and complements other techniques that are attempting to provide positron emission tomography-like measurements related to regional neural activity.

# Hemoglobin

## A Molecule To Breathe With

### HEMOGLOBIN



### Hemoglobin (Hgb):

- four globin chains
- each globin chain contains a heme group
- at center of each heme group is an iron atom (Fe)
- each heme group can attach an oxygen atom ( $O_2$ )
- oxy-Hgb (four  $O_2$ ) is diamagnetic  $\rightarrow$  no  $\Delta B$  effects
- deoxy-Hgb is paramagnetic  $\rightarrow$  if  $[deoxy-Hgb] \downarrow \rightarrow$  local  $\Delta B \downarrow$

# Hemoglobin

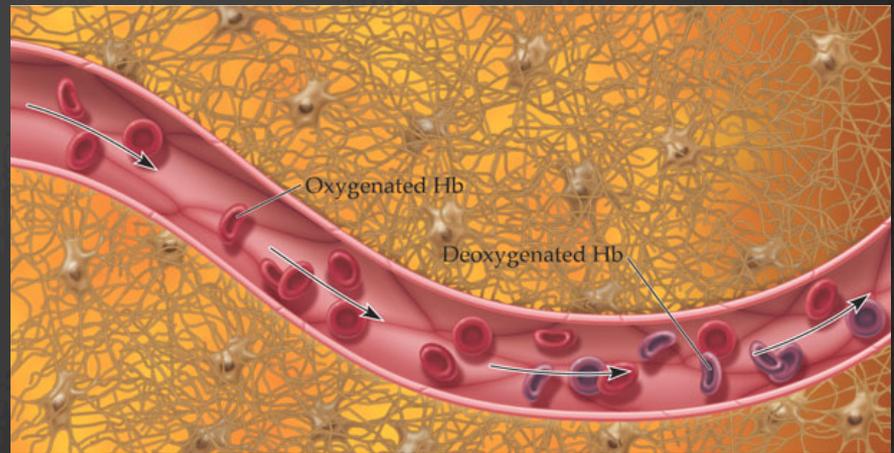
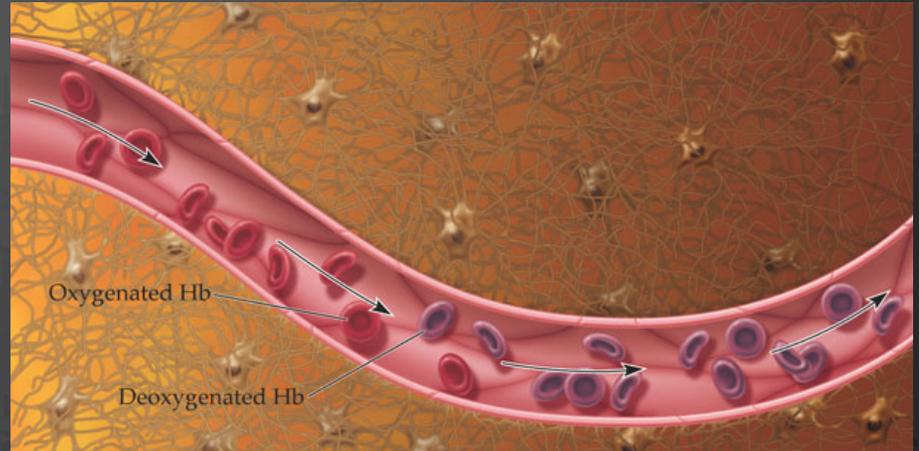
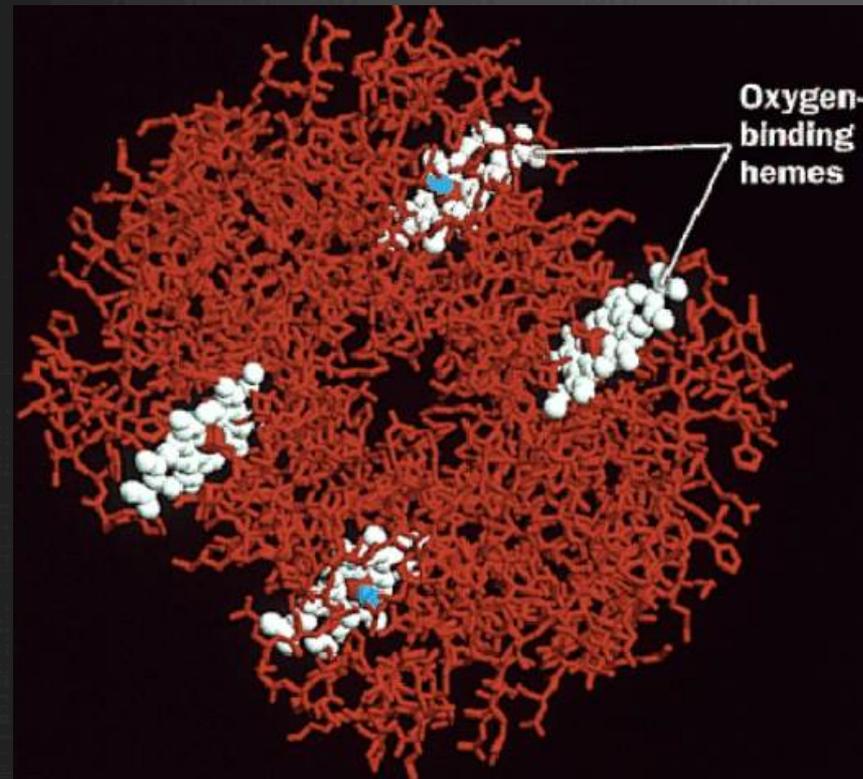


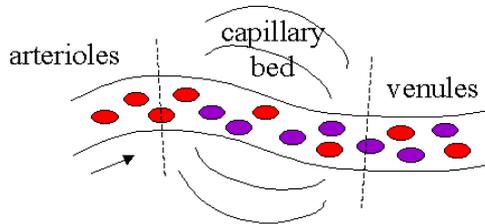
Figure Source, Huettel, Song & McCarthy, 2004,  
*Functional Magnetic Resonance Imaging*

# BOLD signal

Blood Oxygen Level Dependent signal

$\uparrow$  neural activity  $\rightarrow$   $\uparrow$  blood flow  $\rightarrow$   $\uparrow$  oxyhemoglobin  $\rightarrow$   $\uparrow$   $T_2^*$   $\rightarrow$   $\uparrow$  MR signal

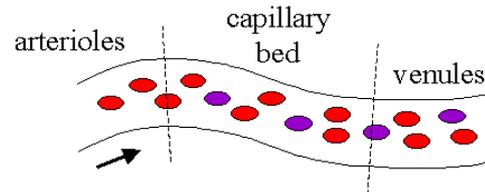
## Basal state



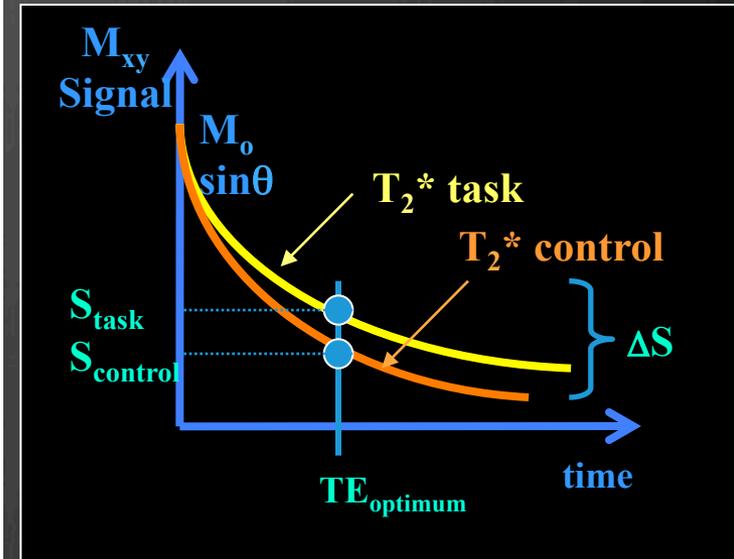
- normal flow
- basal level [Hbr]
- basal CBV
- normal MRI signal

● = HbO<sub>2</sub>  
● = Hbr

## Activated state



- increased flow
- decreased [Hbr] (*lower field gradients around vessels*)
- increased CBV
- increased MRI signal (*from lower field gradients*)



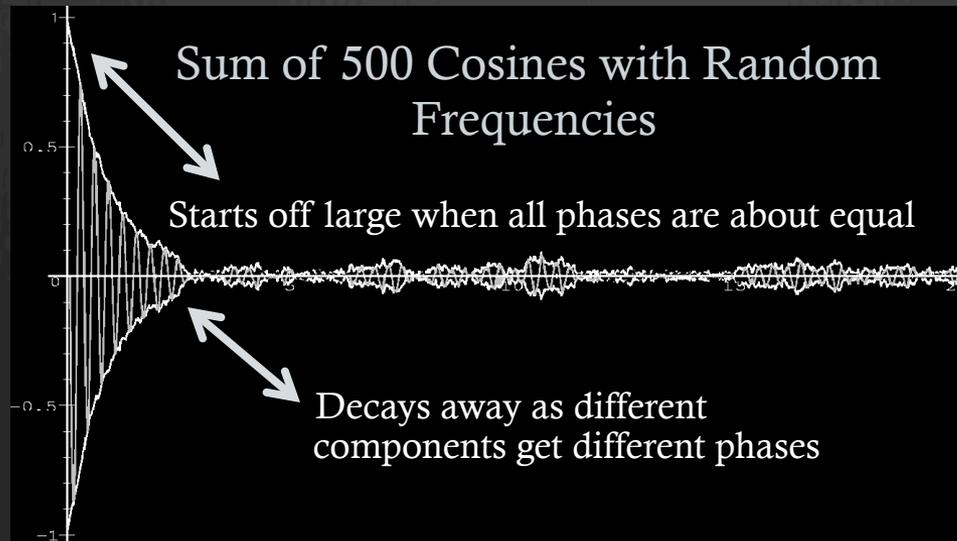
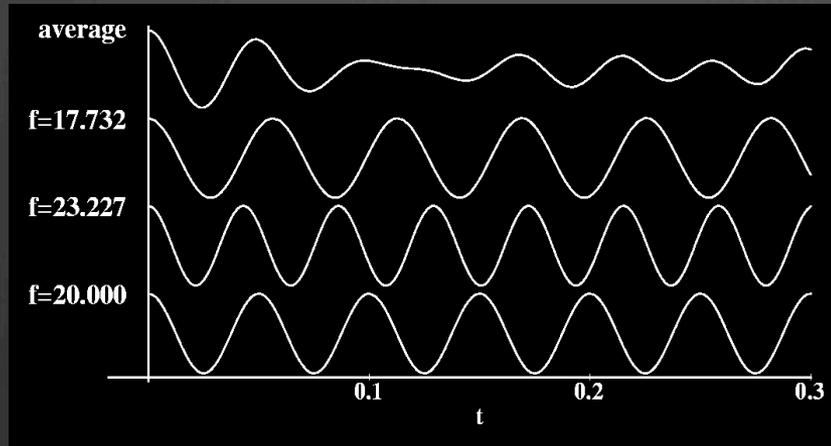
# Susceptibility and BOLD fMRI

- ⊗ **Magnetic susceptibility** ( $\chi$ ) refers to magnetic response of a material when placed in  $B_0$ .
- ⊗ Red blood cells exhibit a change in  $\chi$  during 'activation'
- ⊗ Basically, **oxyhaemoglobin** in the RBC ( $HbO_2$ ) becomes **deoxyhaemoglobin** (Hb):
  - ⊗ Becomes **paramagnetic**.
  - ⊗ Susceptibility difference between venous vasculature and surroundings (susceptibility induced field shifts).

# How Susceptibility Affects Signal

Susceptibility → nonuniform precession frequencies

RF signals from different regions that are at different frequencies will get *out of phase* and thus tend to cancel out

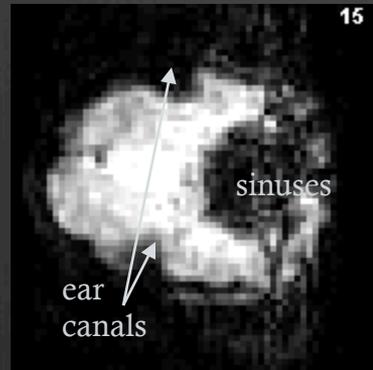
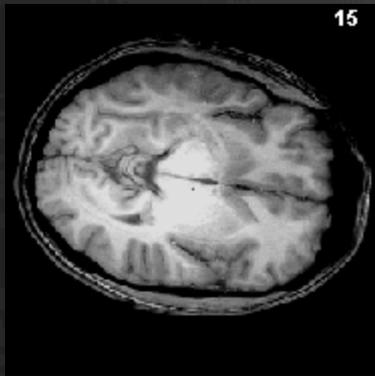


# Susceptibility and Susceptibility Artifacts

Adding a nonuniform object (like a person) to  $B_0$  will make the total magnetic field  $B$  nonuniform

This is due to *susceptibility*: generation of extra magnetic fields in materials that are immersed in an external field

For large scale (10+ cm) inhomogeneities, scanner-supplied nonuniform magnetic fields can be adjusted to “even out” the ripples in  $B$  — this is called *shimming*



## Susceptibility Artifact

- occurs near junctions between air and tissue
- sinuses, ear canals

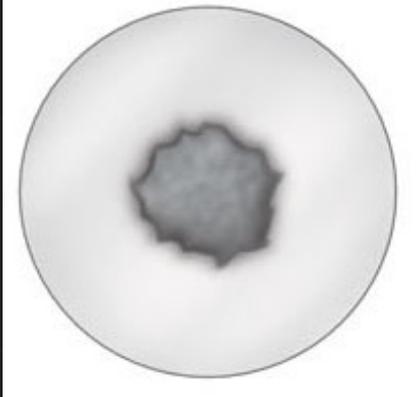
# Deoxygenated Blood → Signal

## Loss



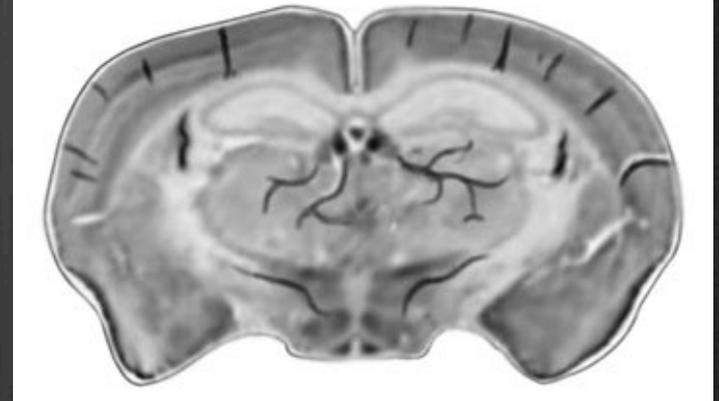
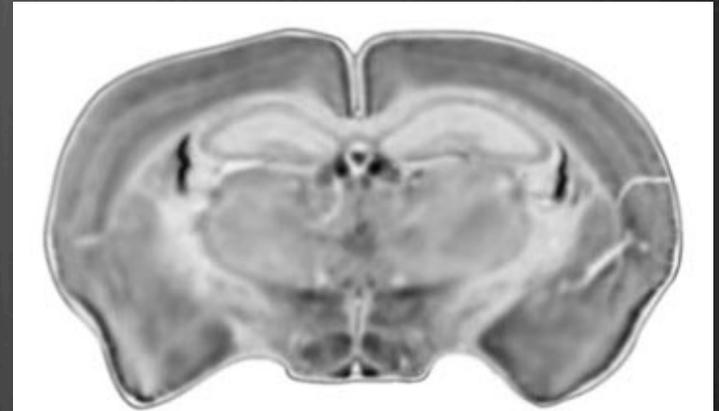
Oxygenated blood?

No signal loss...



Deoxygenated blood?

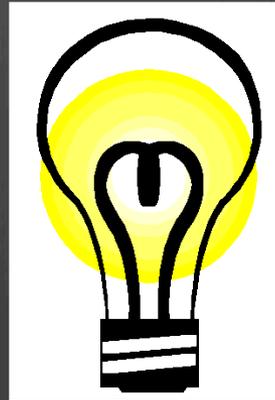
Signal loss!!!



# The Benefit of Susceptibility

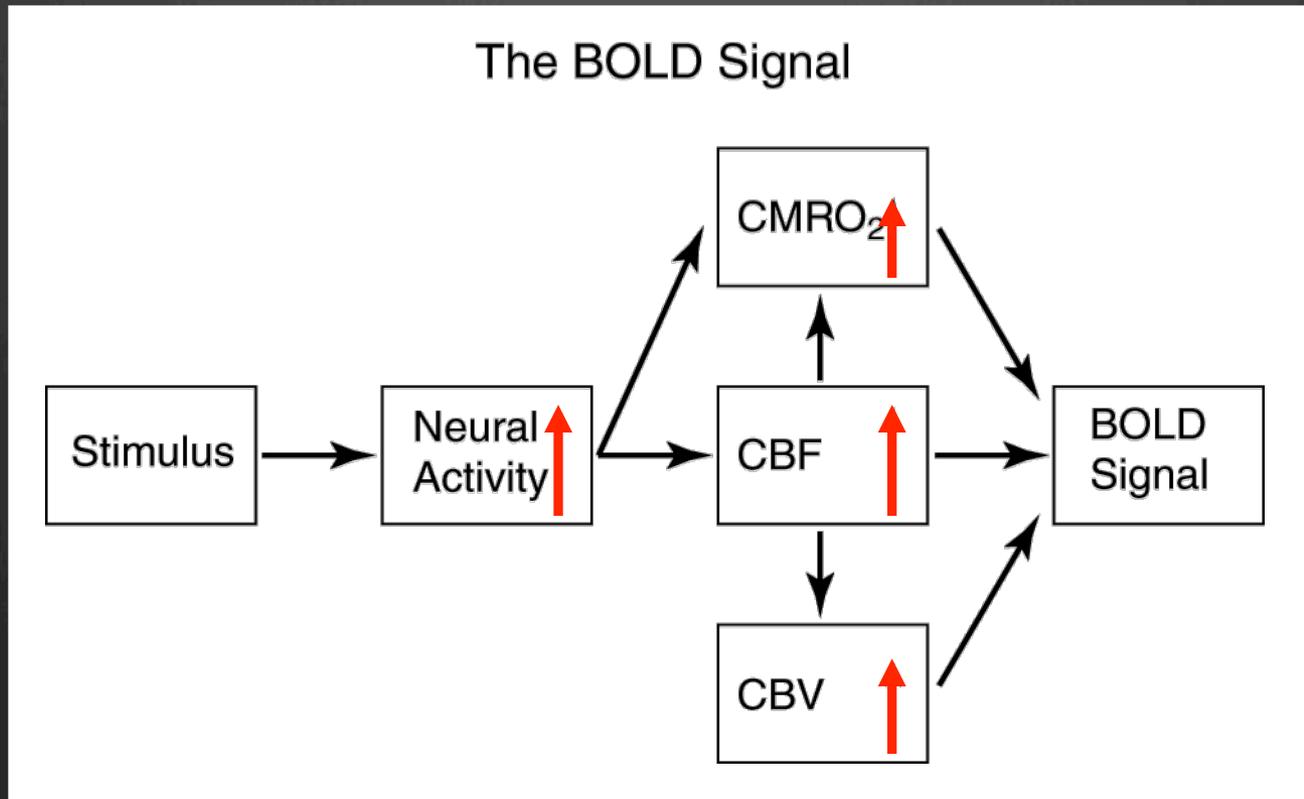
Susceptibility variations can also be seen around blood vessels where deoxyhemoglobin affects  $T2^*$  in nearby tissue

Aha!



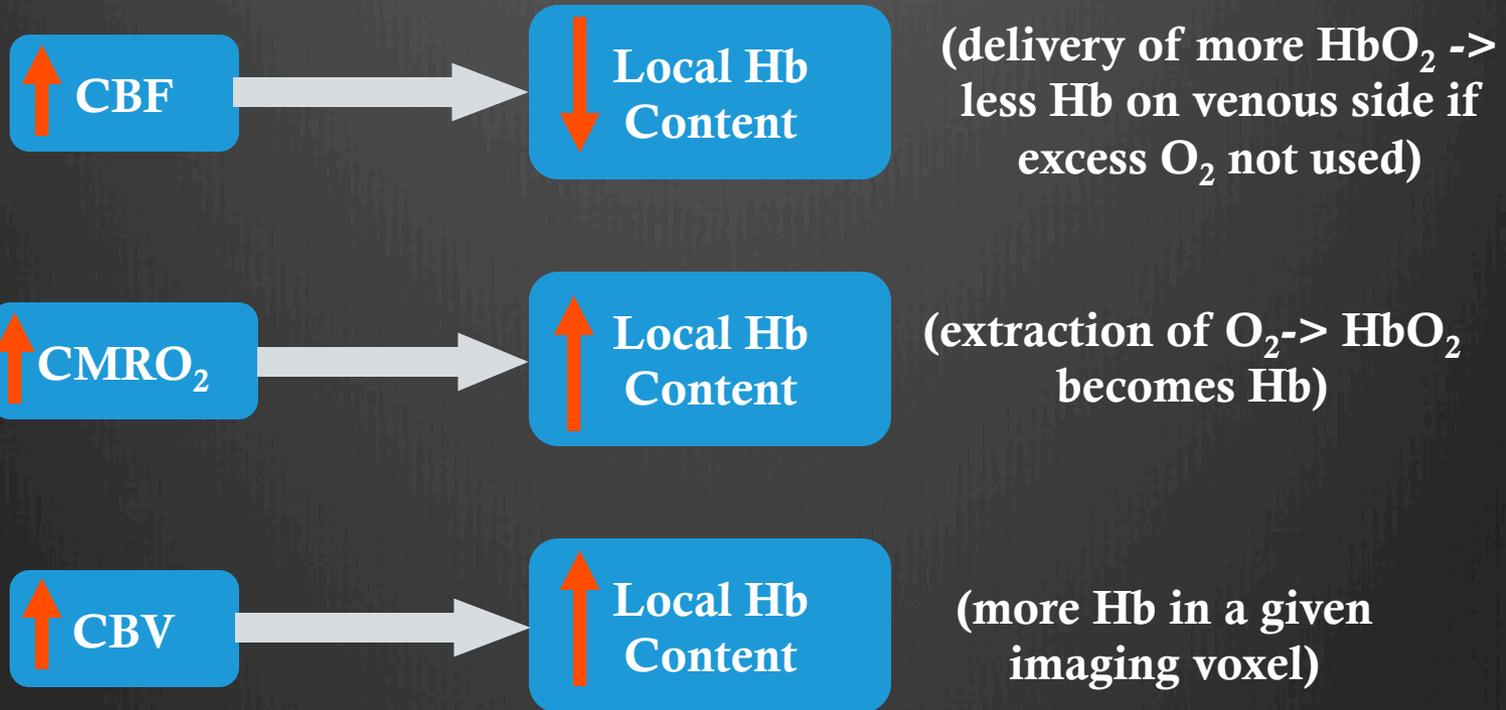
# BOLD signal

Blood Oxygen Level Dependent signal



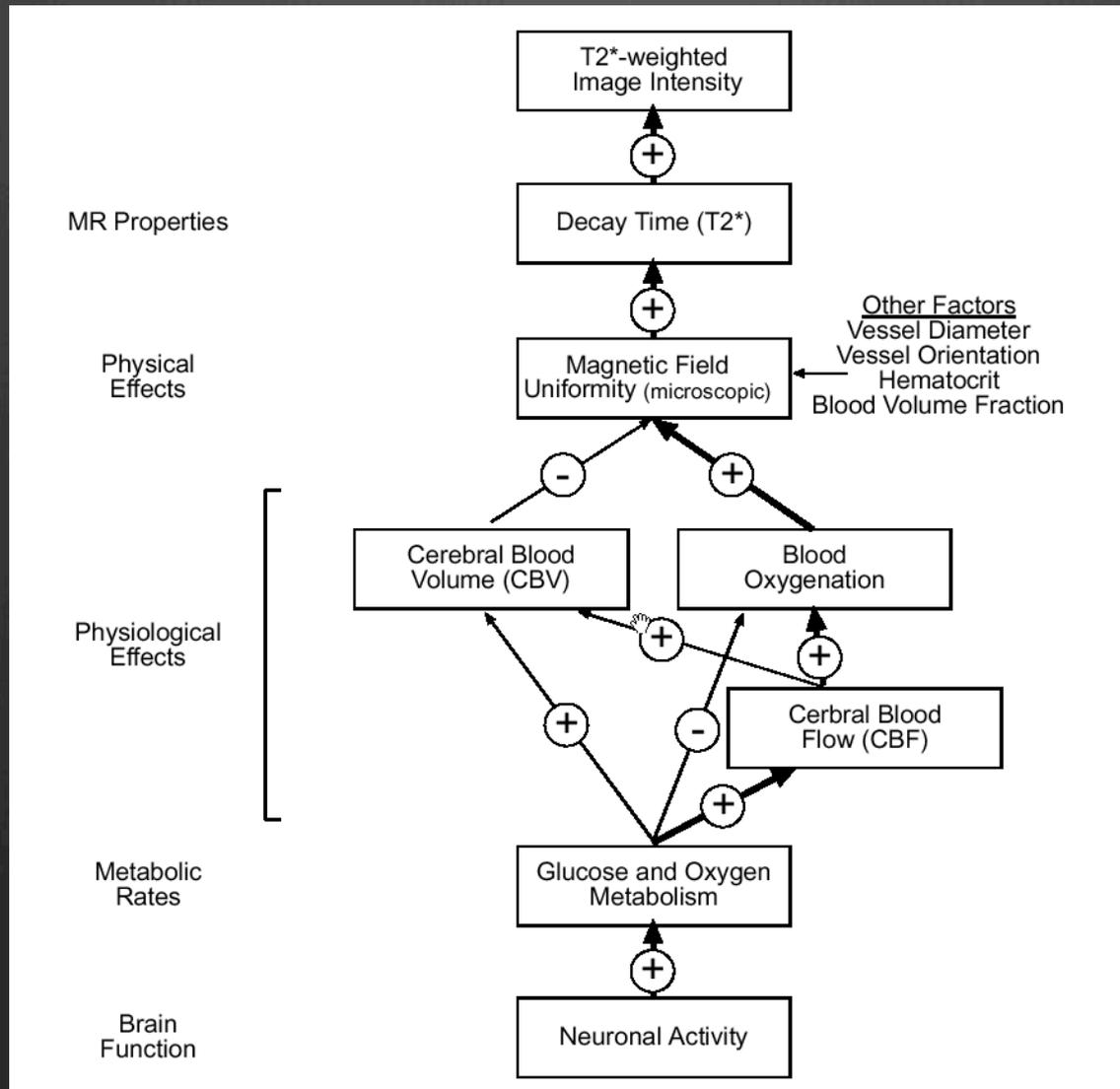
# BOLD signal

- CBF, CBV, and CMRO<sub>2</sub> have different effects on HbO<sub>2</sub> concentration. Blood Oxygen Level Dependent signal



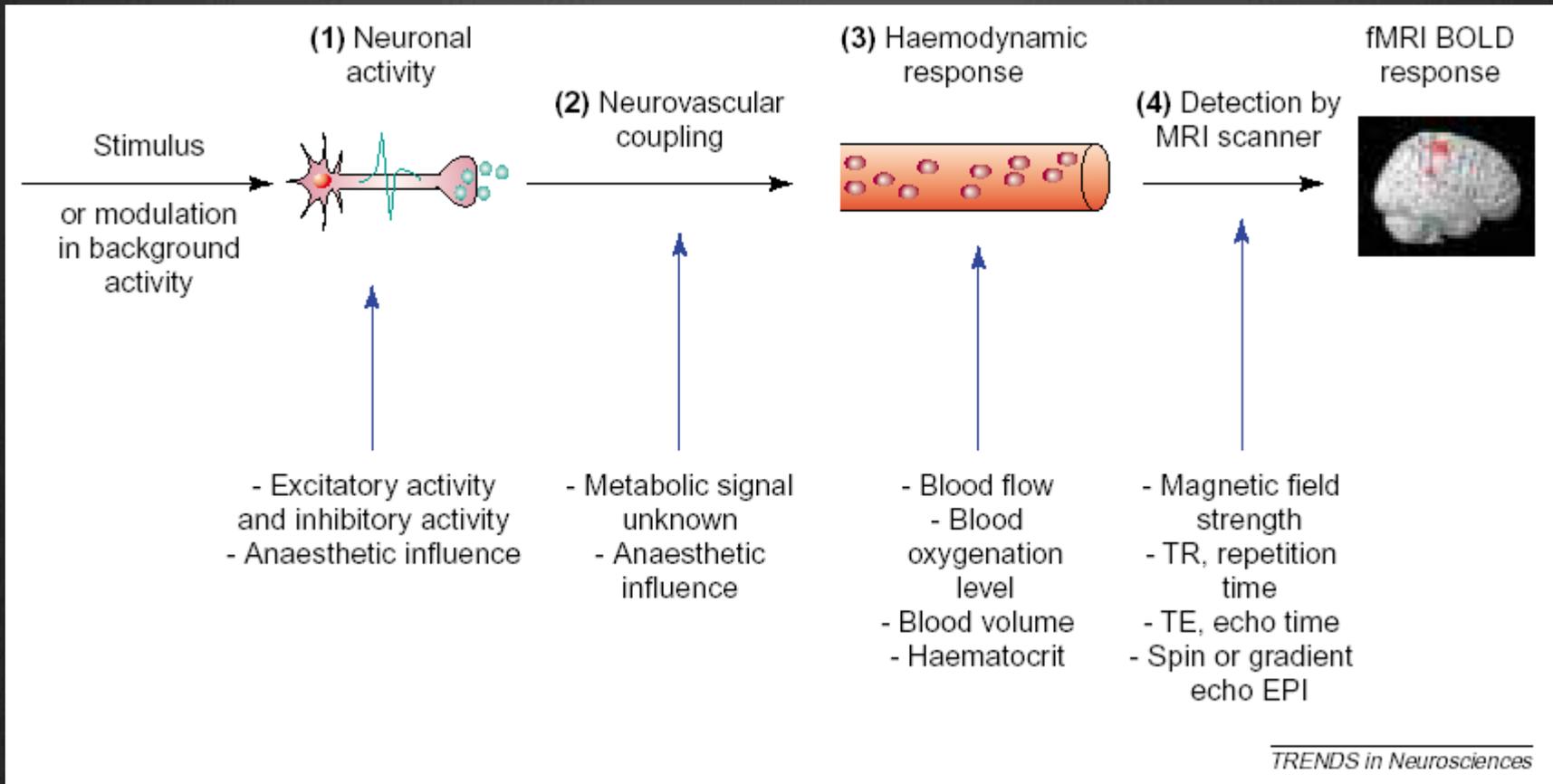
- Interaction of these 3 produce BOLD response
  - They change [Hb] which affects magnetic environment.

# BOLD signal



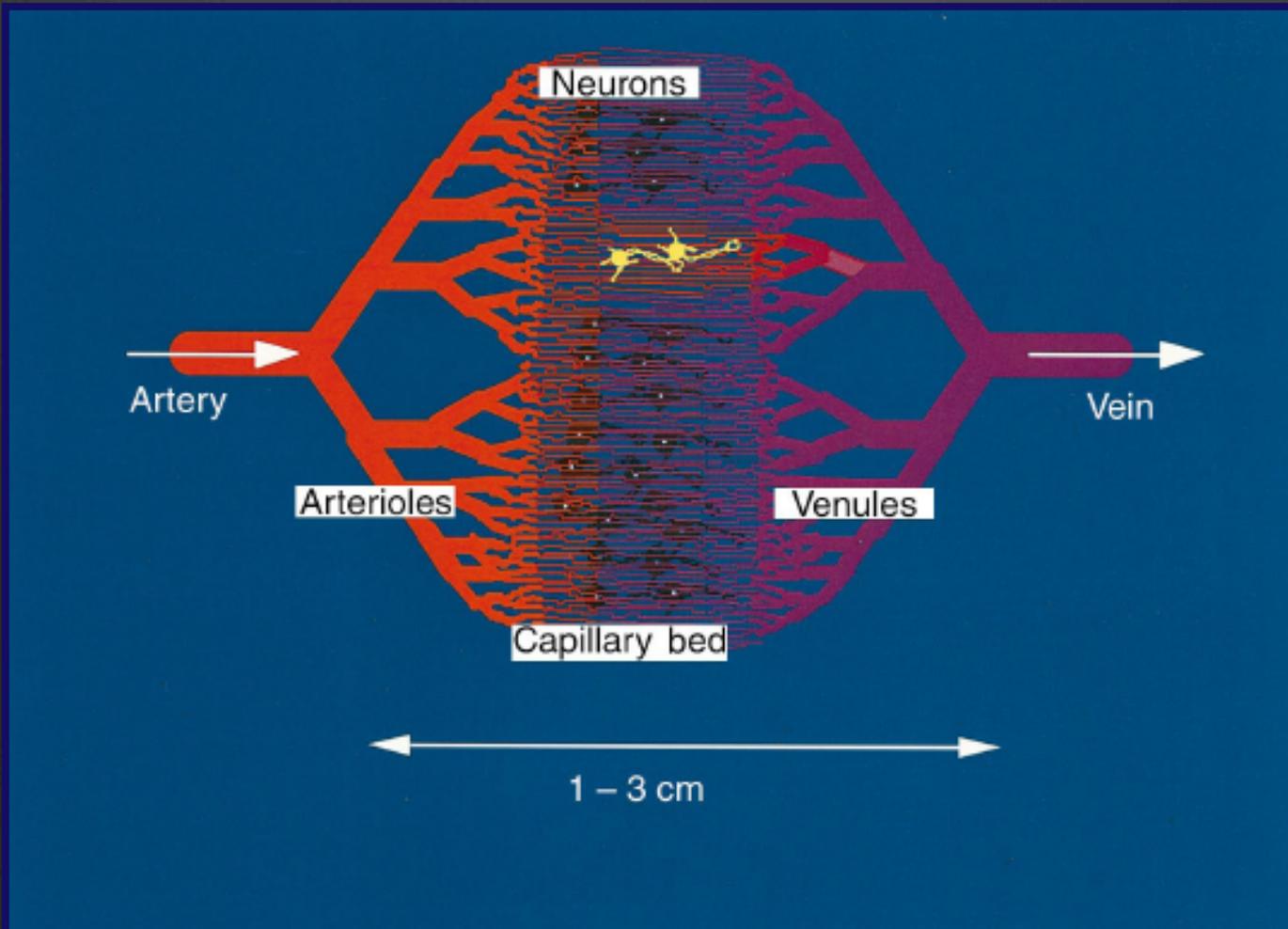
Neurons → BOLD

# Stimulus to BOLD

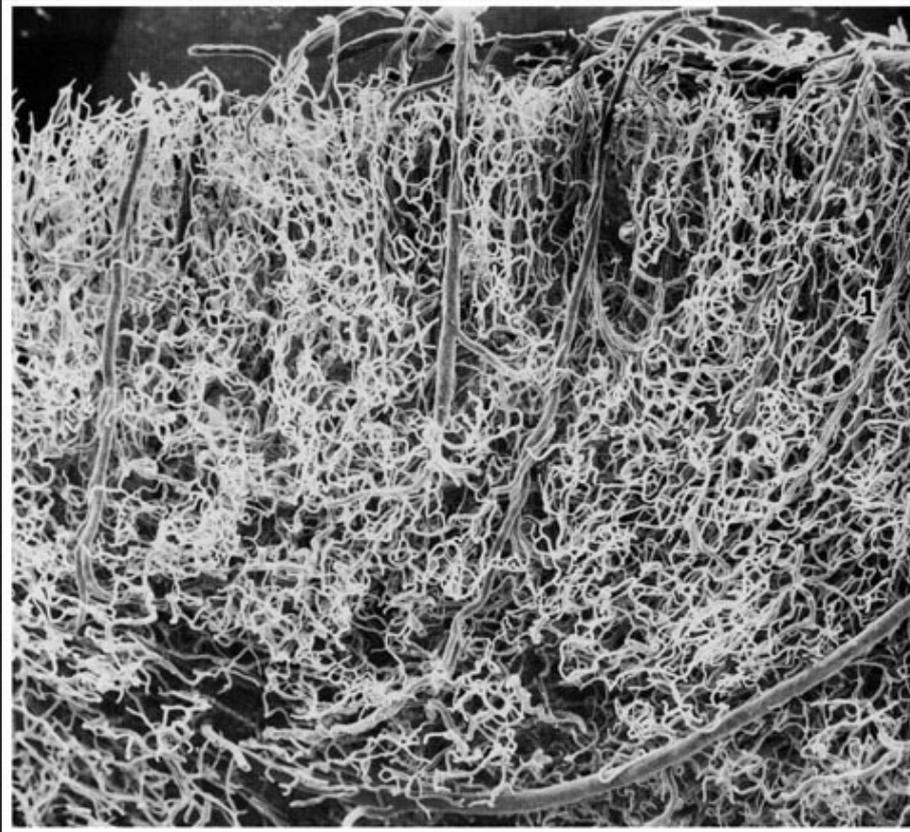


Source: Arthurs & Boniface, 2002, *Trends in Neurosciences*

# Vasculature



# Macro- vs. micro- vasculature



Capillary beds within the cortex.

## Macrovasculature:

vessels  $> 25 \mu\text{m}$  radius  
(cortical and pial veins)  
 $\Rightarrow$  linear and oriented  
 $\therefore$  cause both magnitude  
and phase changes

## Microvasculature:

vessels  $< 25 \mu\text{m}$  radius  
(venuoles and capillaries)  
 $\Rightarrow$  randomly oriented  
 $\therefore$  cause only magnitude  
changes

# Neuron → BOLD?

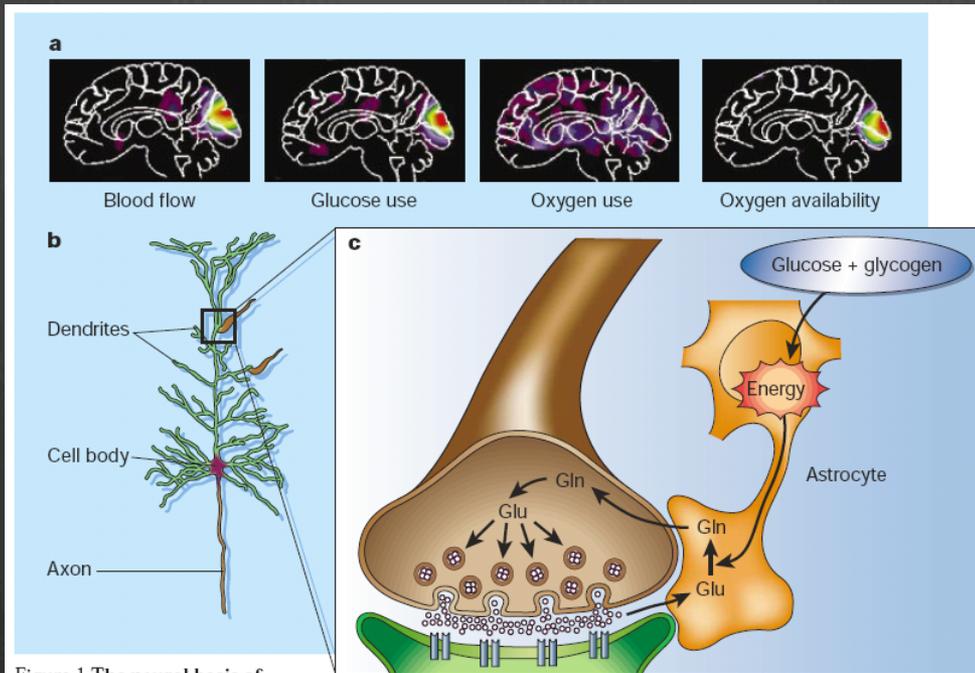
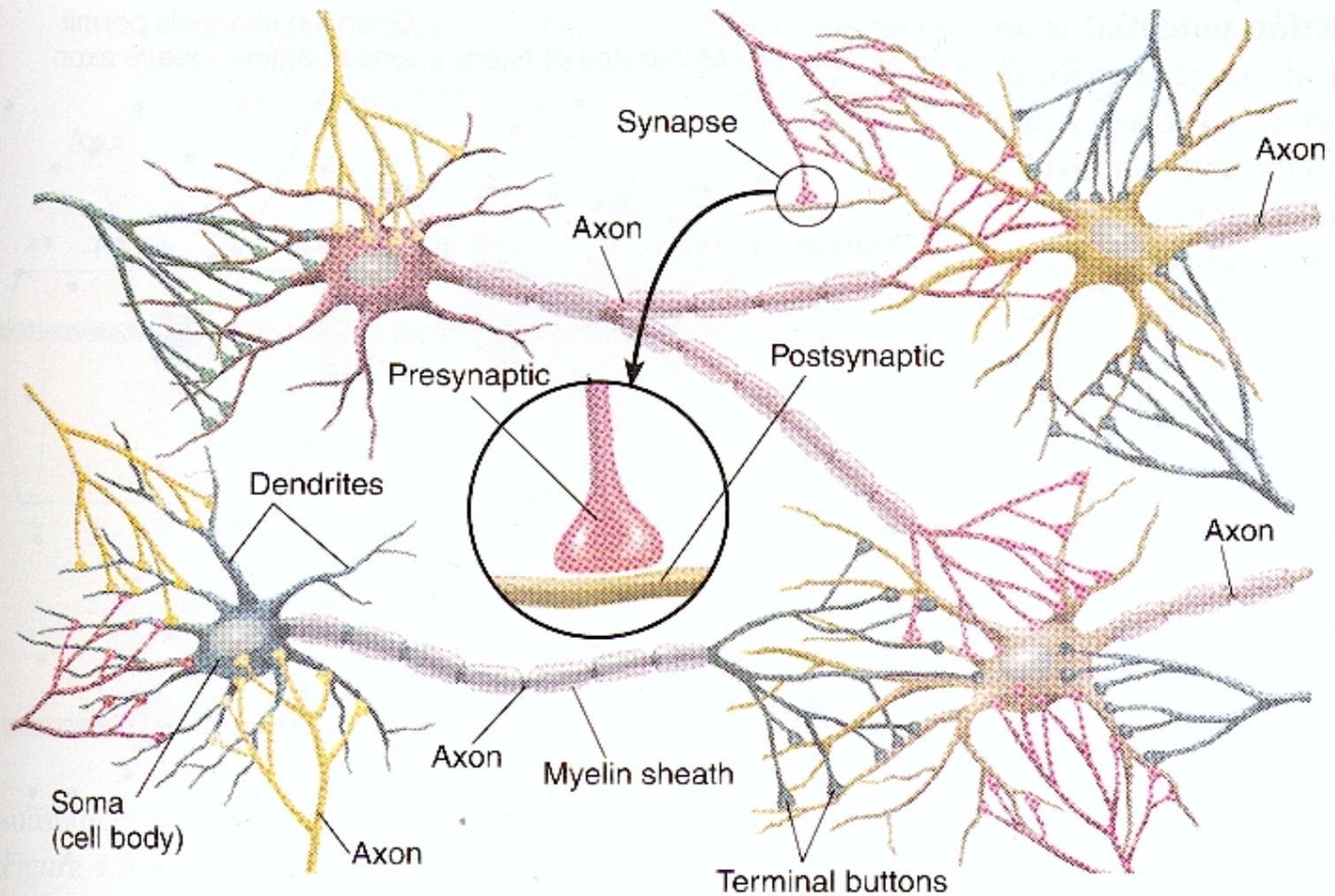


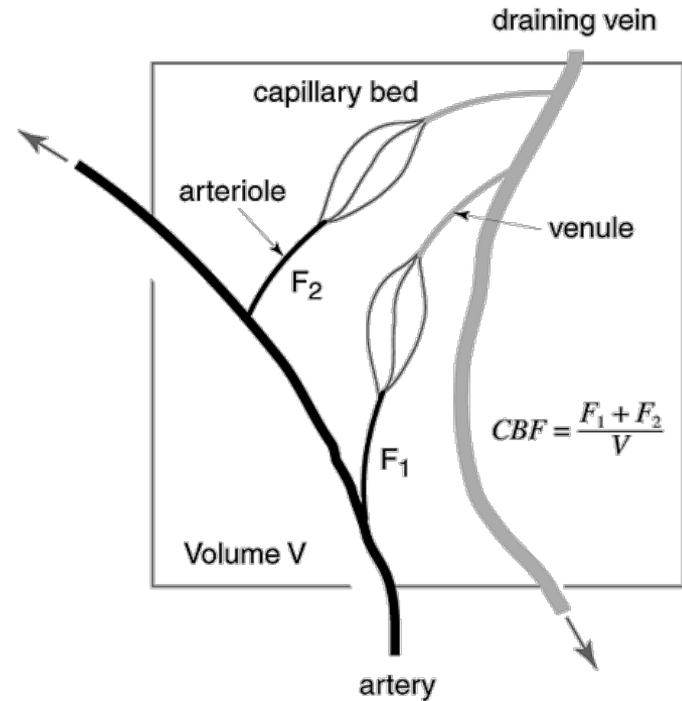
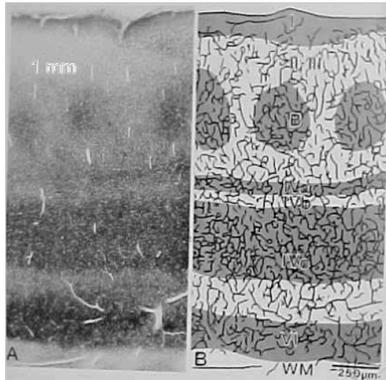
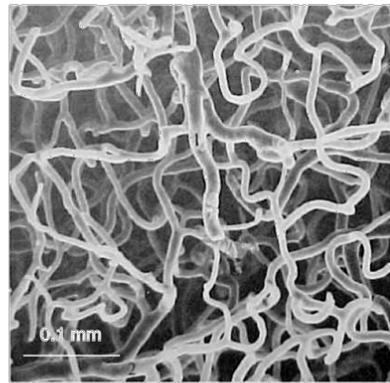
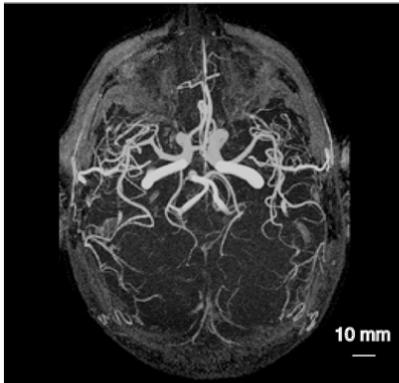
Figure 1 The neural basis of functional magnetic resonance imaging (fMRI). a, Viewing a stimulus such as a checkerboard produces marked changes in the areas of the brain that respond to visual stimuli, as seen in these positron-emission tomographic (PET) images. These changes include increases in glucose use and blood flow that are much greater than those in oxygen consumption. As a result there is an increase in the oxygen level in those areas (supply exceeds demand). PET is usually used to monitor blood flow. fMRI detects the changes in oxygen availability as a local change in the magnetic field. The resulting fMRI signal is a 'blood-oxygen-level-dependent' (BOLD) signal. b, As Logothetis *et al.*<sup>2</sup> show, these metabolic and circulatory changes are driven by electrical potentials arising from the input to, and information processing within, the dendrites of neurons. c, An attractive explanation for the BOLD signal invokes the preferential use of glycolysis in nearby non-neuronal cells (astrocytes) to handle an increase in the release of the neurotransmitter glutamate (Glu), which must be converted to glutamine (Gln) before it is returned to the neuron. Glycolysis consumes glucose to produce energy, but does not require oxygen.

# Neural Networks

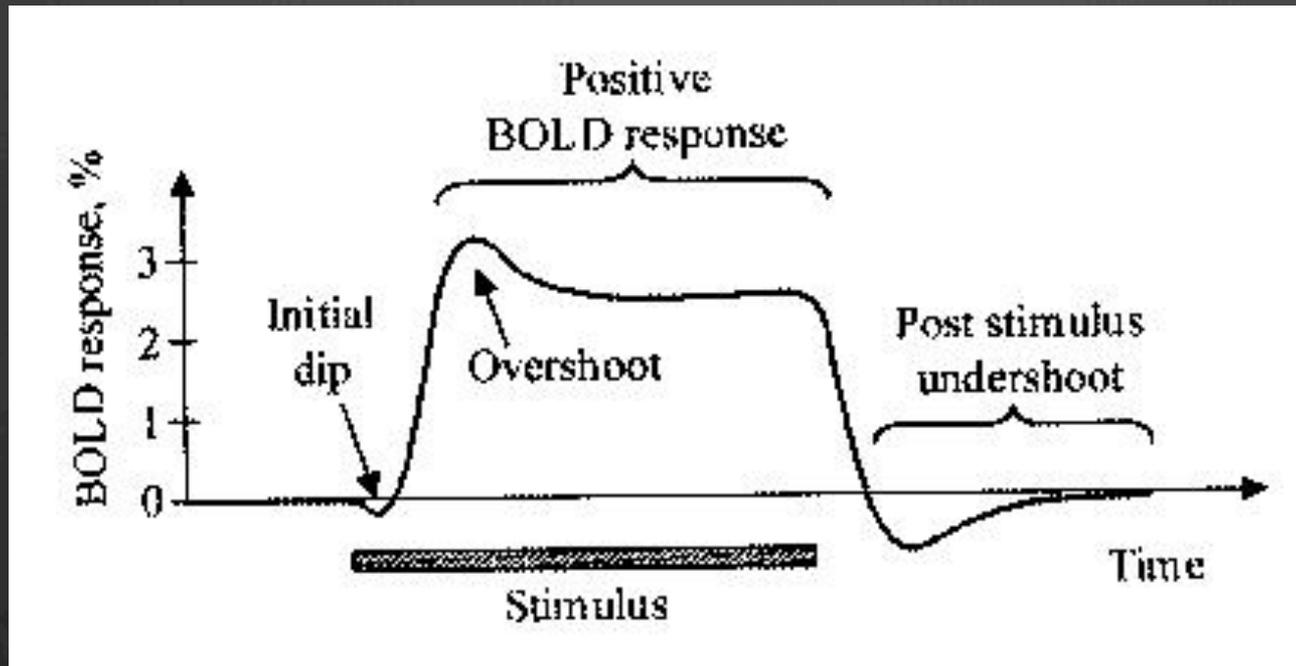


# Vascular network and BOLD

## Cerebral Vasculature



# Hemodynamic Response Function



% signal change

=  $(\text{point} - \text{baseline}) / \text{baseline}$   
usually 0.5-3%

time to rise

signal begins to rise soon after stimulus begins

initial dip

-more focal and potentially a better measure

-somewhat elusive so far, not everyone can find it

time to peak

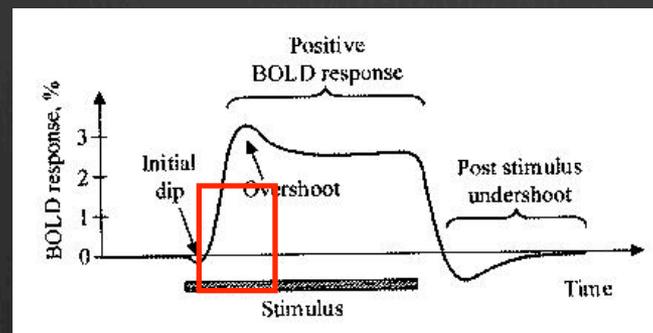
signal peaks 4-6 sec after stimulus begins

post stimulus undershoot

signal suppressed after stimulation ends

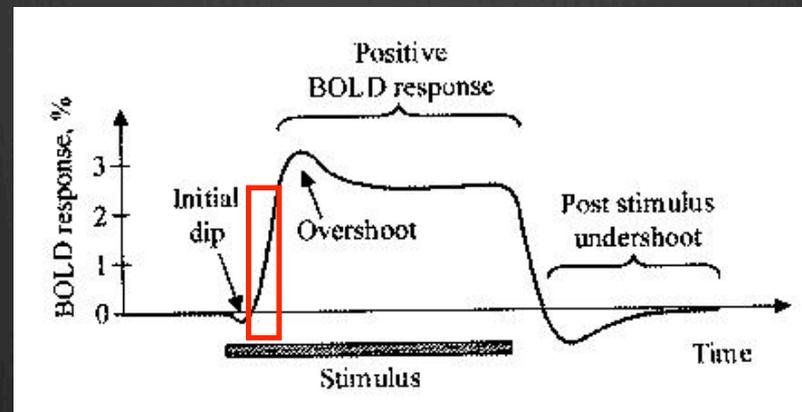
# Initial Dip (Hypo-oxic Phase)

- Transient increase in oxygen consumption, before change in blood flow
  - Menon et al., 1995; Hu, et al., 1997
- Smaller amplitude than main BOLD signal
  - 10% of peak amplitude (e.g., 0.1% signal change)
- Potentially more spatially specific
  - Oxygen utilization may be more closely associated with neuronal activity than positive response



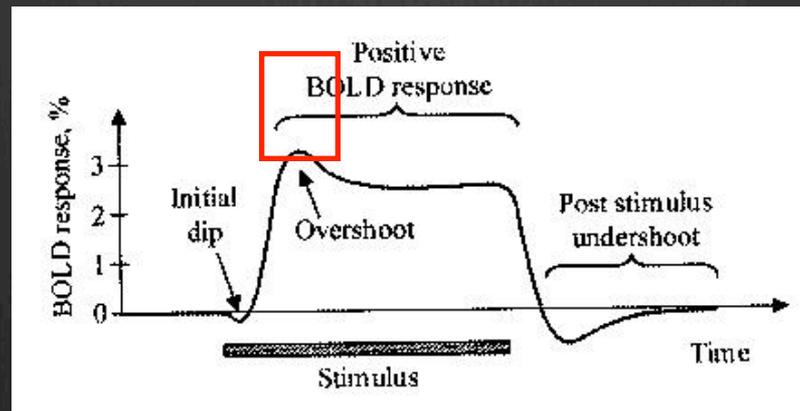
# Rise (Hyperoxic Phase)

- ⦿ Results from vasodilation of arterioles, resulting in a large increase in cerebral blood flow
- ⦿ Inflection point can be used to index onset of processing



# Peak – Overshoot

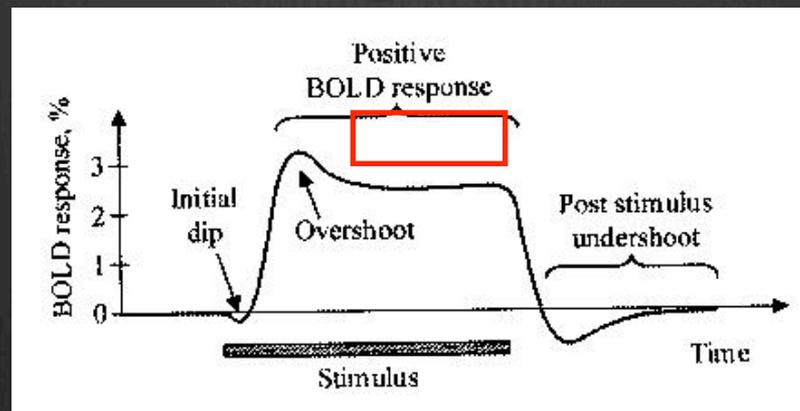
- Over-compensatory response
  - More pronounced in BOLD signal measures than flow measures
- Overshoot found in blocked designs with extended intervals
  - Signal saturates after ~10s of stimulation



Slide modified from  
Duke course

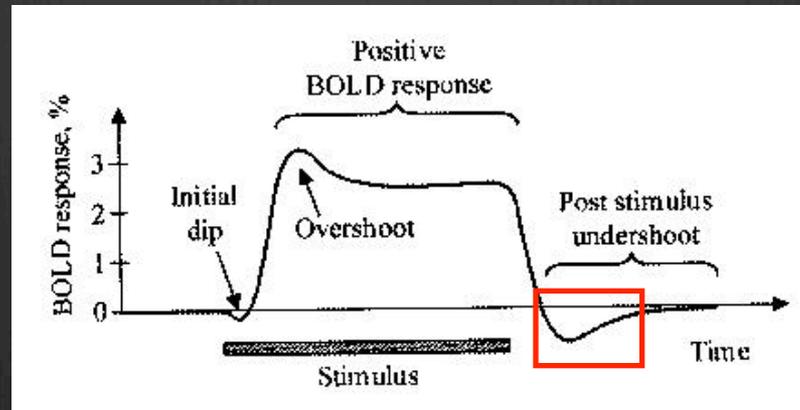
# Sustained Response

- ⊗ Blocked design analyses rest upon presence of sustained response
  - ⊗ Comparison of sustained activity vs. baseline
  - ⊗ Statistically simple, powerful
- ⊗ Problems
  - ⊗ Difficulty in identifying magnitude of activation
  - ⊗ Little ability to describe form of hemodynamic response
  - ⊗ May require detrending of raw time course



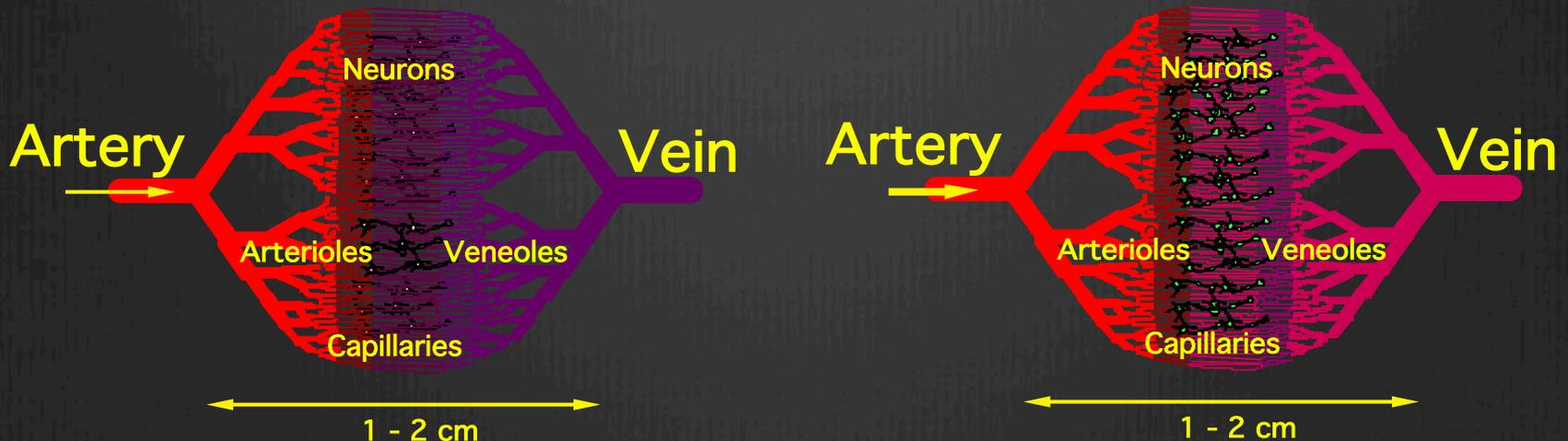
# Undershoot

- ⊗ Cerebral blood flow more locked to stimuli than cerebral blood volume
  - ⊗ Increased blood volume with baseline flow leads to decrease in MR signal
- ⊗ More frequently observed for longer-duration stimuli (>10s)
  - ⊗ Short duration stimuli may not evidence
  - ⊗ May remain for 10s of seconds



# Hyperoxygenation Phase

- ⊗ Tightly coupled to neural metabolic activity (theoretically).
- ⊗ Due to the imbalance of  $\Delta CBF \gg \Delta CMRO_2$ 
  - ⊗ Results in increase in  $[HbO_2]$  on venous side of capillary bed.
- ⊗ Seen in both small and large vessels.
- ⊗ Majority of fMRI studies are based on mapping of this response.



# Fast Response

- ⊗ Amplitude is independent of stimulus duration
  - ⊗ Except for stimuli  $< 2s$ .
- ⊗ Correlates with optical measurements.
- ⊗ Could reflect:
  - 1) initial  $+\Delta CMRO_2$  and  $O_2$  extraction from vasculature (\*).
  - 2) decrease in blood flow.
  - 3) or rapid increase in capillary and venous blood volume.
- ⊗ Seen in small vessels and capillary bed
  - ⊗ *Spatially closer to site of increased electrical activity and cellular metabolism.*
  - ⊗ Mapping of fast/early response has potential to overcome some spatial specificity problems in fMRI.

# Post-Response Undershoot

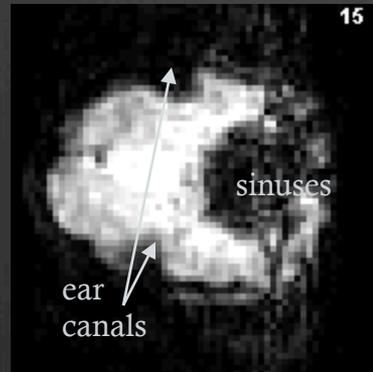
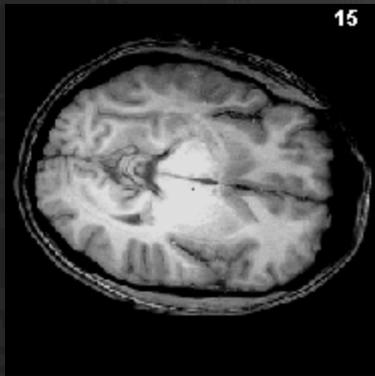
- ⊗ Amplitude is dependent on duration of stimuli.
- ⊗ *Very* slow to recover (eg.-1 minute!).
- ⊗ Likely due to either:
  - 1) unbalanced metabolic energetics ( $\text{CMRO}_2$  still elevated).
  - 2) or slow return of increased CBV fraction to basal state after end of stimulus (\*).
- ⊗ Larger than fast response.
- ⊗ Spatially, correlates more with hyperoxygenation phase.
- ⊗ Seen in both large and small vessels (more so small).
- ⊗ Does not reflect directly on energy metabolism.

# Susceptibility and Susceptibility Artifacts

Adding a nonuniform object (like a person) to  $B_0$  will make the total magnetic field  $B$  nonuniform

This is due to *susceptibility*: generation of extra magnetic fields in materials that are immersed in an external field

For large scale (10+ cm) inhomogeneities, scanner-supplied nonuniform magnetic fields can be adjusted to “even out” the ripples in  $B$  — this is called *shimming*



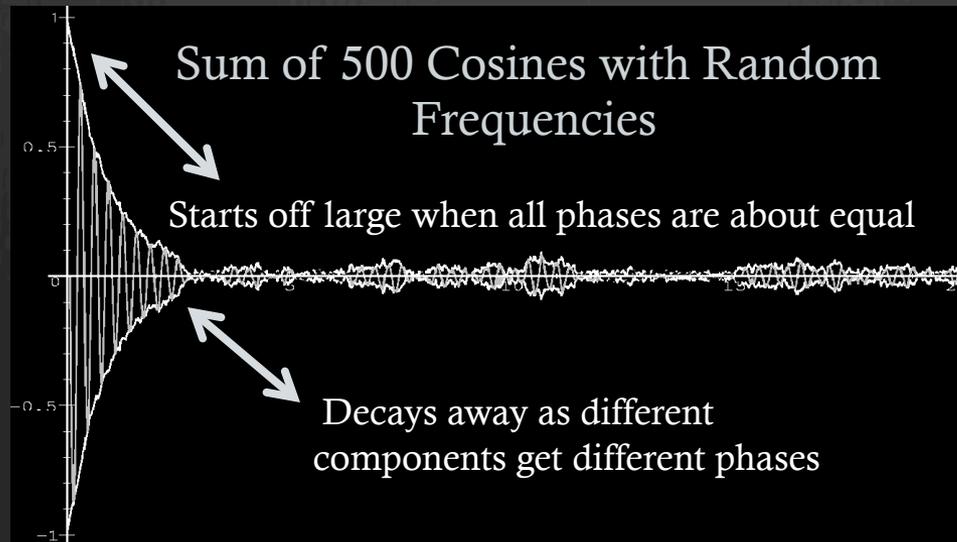
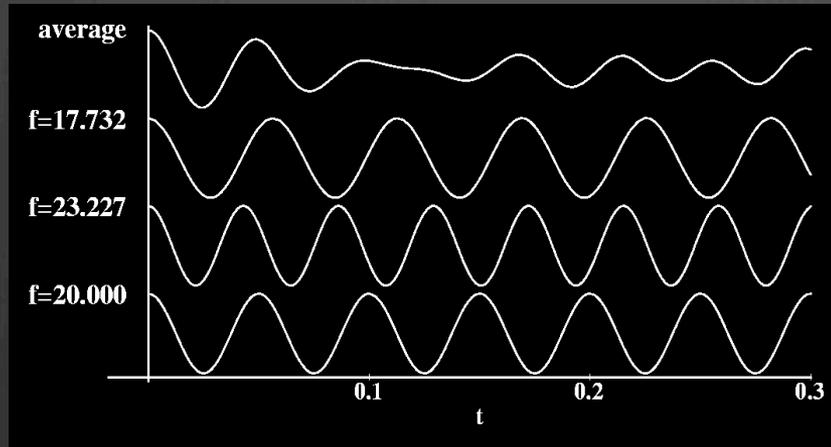
## Susceptibility Artifact

- occurs near junctions between air and tissue
- sinuses, ear canals

# How Susceptibility Affects Signal

Susceptibility → nonuniform precession frequencies

RF signals from different regions that are at different frequencies will get *out of phase* and thus tend to cancel out



# Category-Specific Visual Areas



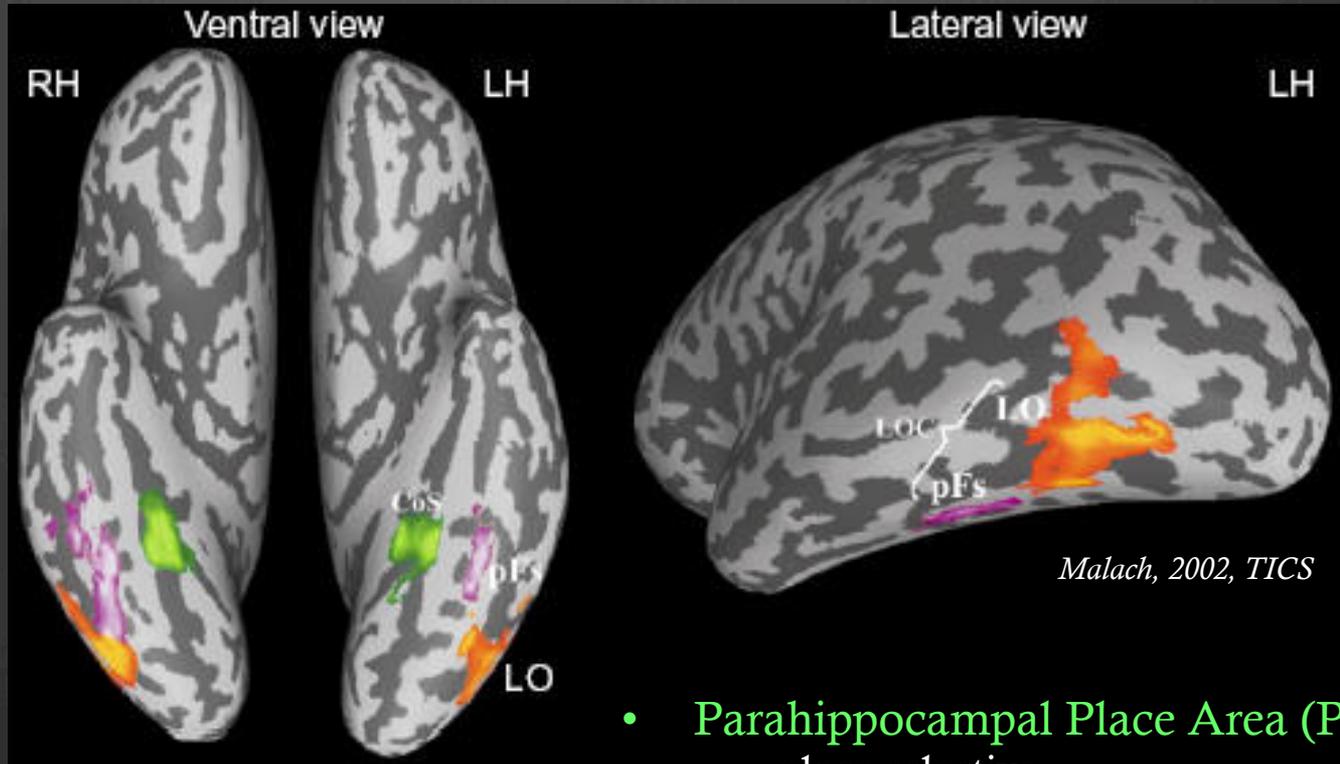
objects



faces



places

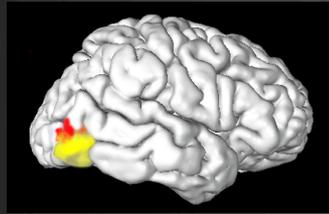


- **Lateral Occipital (LO)**
  - object-selective
  - objects > (faces & scenes)
  - objects > scrambled images

- **Parahippocampal Place Area (PPA)**
  - place-selective
  - places > (objects and faces)
  - places > scrambled images
- **Fusiform Face Area (FFA) or pFs**
  - face-selective
  - faces > (objects & scenes)
  - faces > scrambled images
  - ~ posterior fusiform sulcus (pFs)

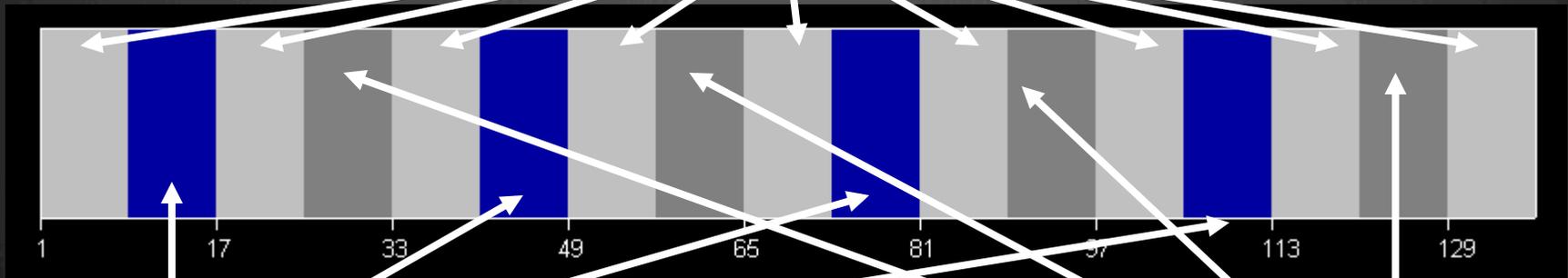
# A Simple Experiment: LO

## Localizer

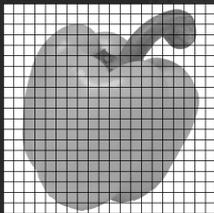


Lateral Occipital Complex  
• responds when subject views objects

Blank  
Screen

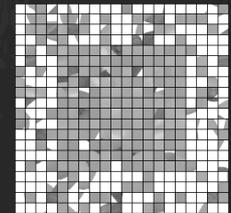


Intact  
Objects



TIME →

Scrambled  
Objects



One volume (12 slices) every 2 seconds for 272 seconds (4 minutes, 32 seconds)

Condition changes every 16 seconds (8 volumes)

# fMRI Experiment Stages: Prep

## 1) Prepare subject

- Consent form
- Safety screening
- Instructions and practice trials if appropriate

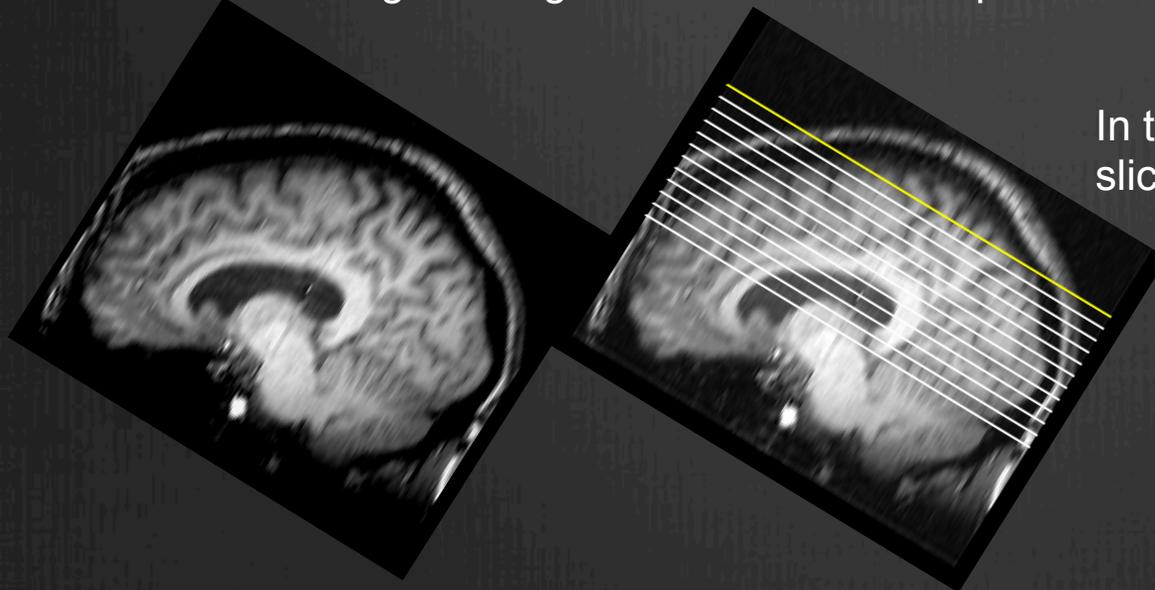
## 2) Shimming

- putting body in magnetic field makes it non-uniform
- adjust 3 orthogonal weak magnets to make magnetic field as homogenous as possible

## 3) Sagittals

Note: That's one g, two t's

Take images along the midline to use to plan slices



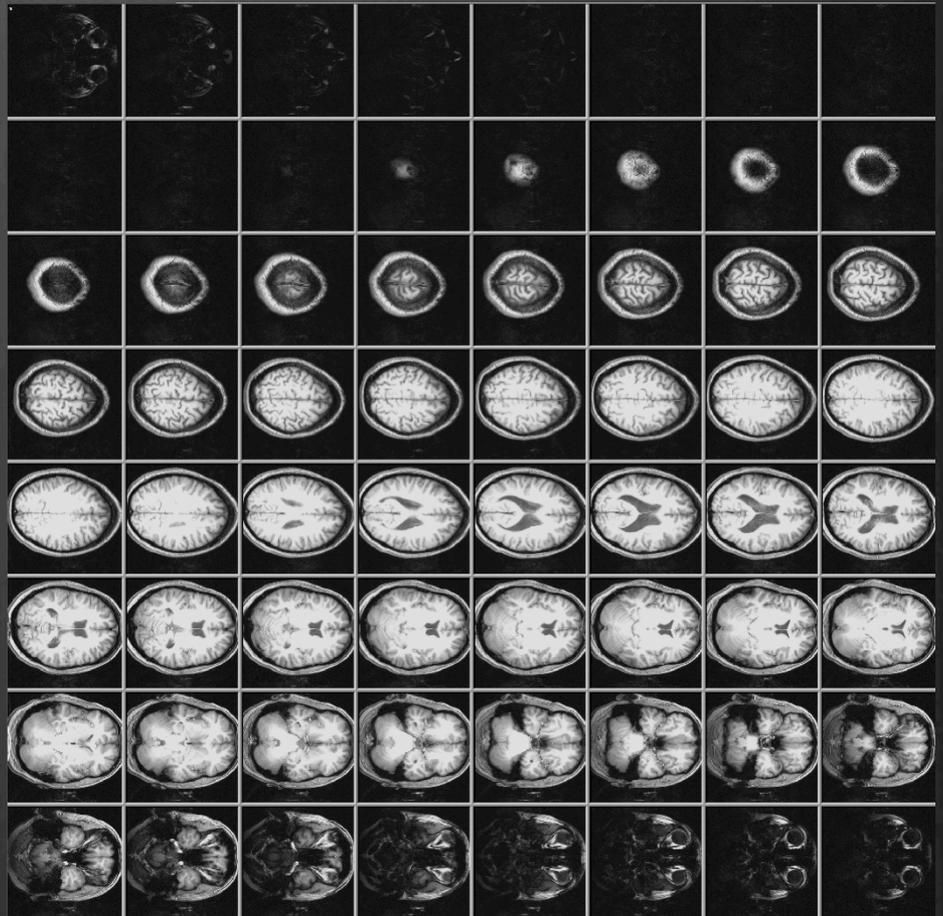
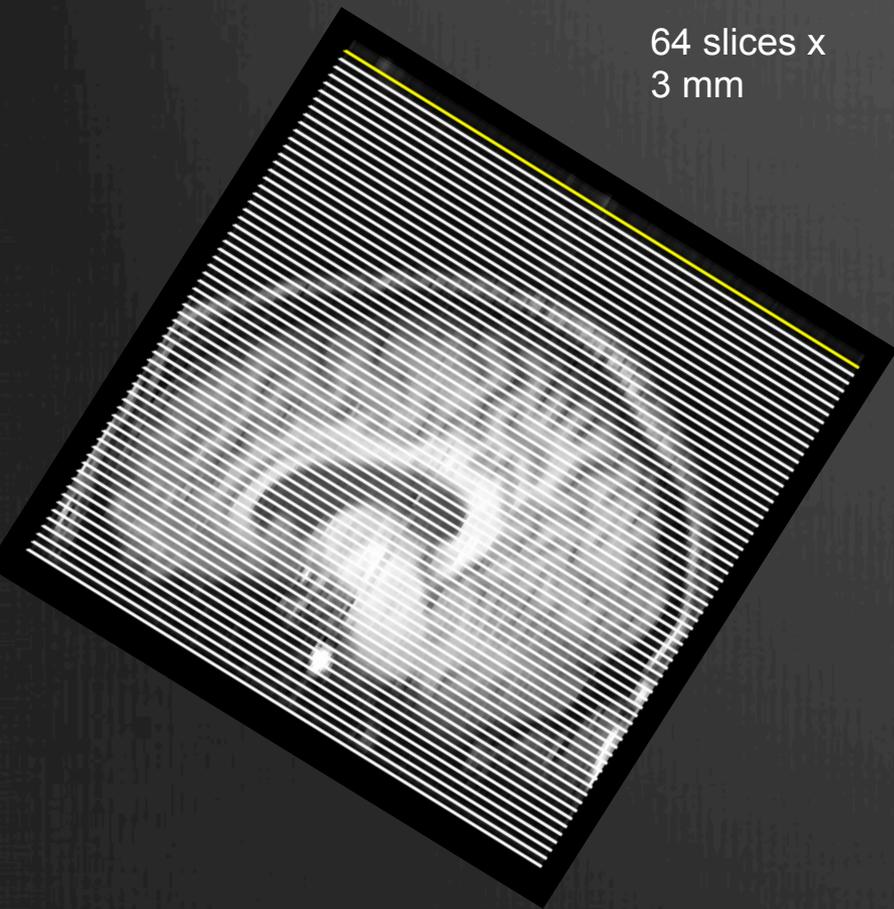
In this example, these are the *functional* slices we want: 12 slices x 6 mm

# fMRI Experiment Stages:

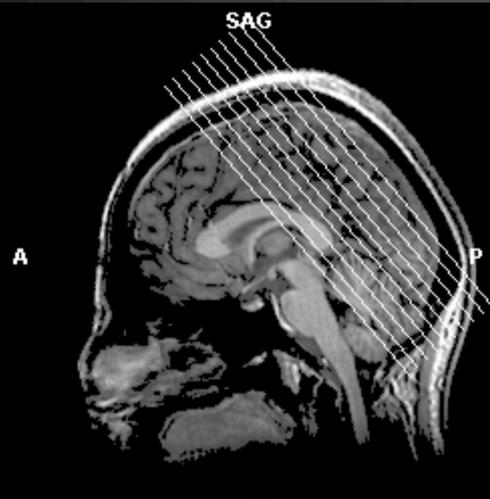
## Anatomicals

### 4) Take anatomical (T1) images

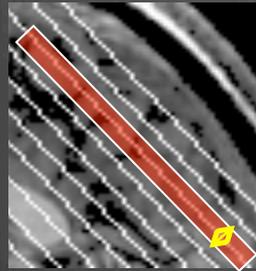
- high-resolution images (e.g., 0.75 x 0.75 x 3.0 mm)
- 3D data: 3 spatial dimensions, sampled at one point in time
- 64 anatomical slices takes ~4 minutes



# Slice Terminology

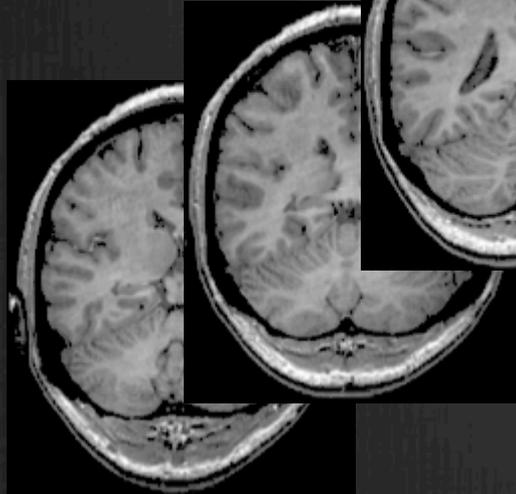


**SAGITTAL SLICE**



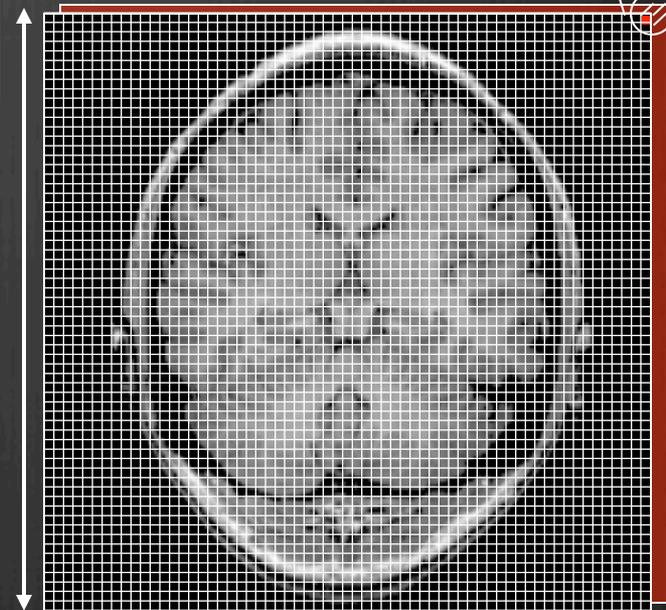
Slice Thickness  
e.g., 6 mm

Number of Slices  
e.g., 10



Matrix Size  
e.g., 64 x 64

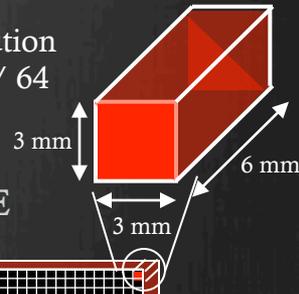
Field of View (FOV)  
e.g., 19.2 cm



**IN-PLANE SLICE**

In-plane resolution  
e.g., 192 mm / 64  
= 3 mm

**VOXEL**  
(Volumetric Pixel)

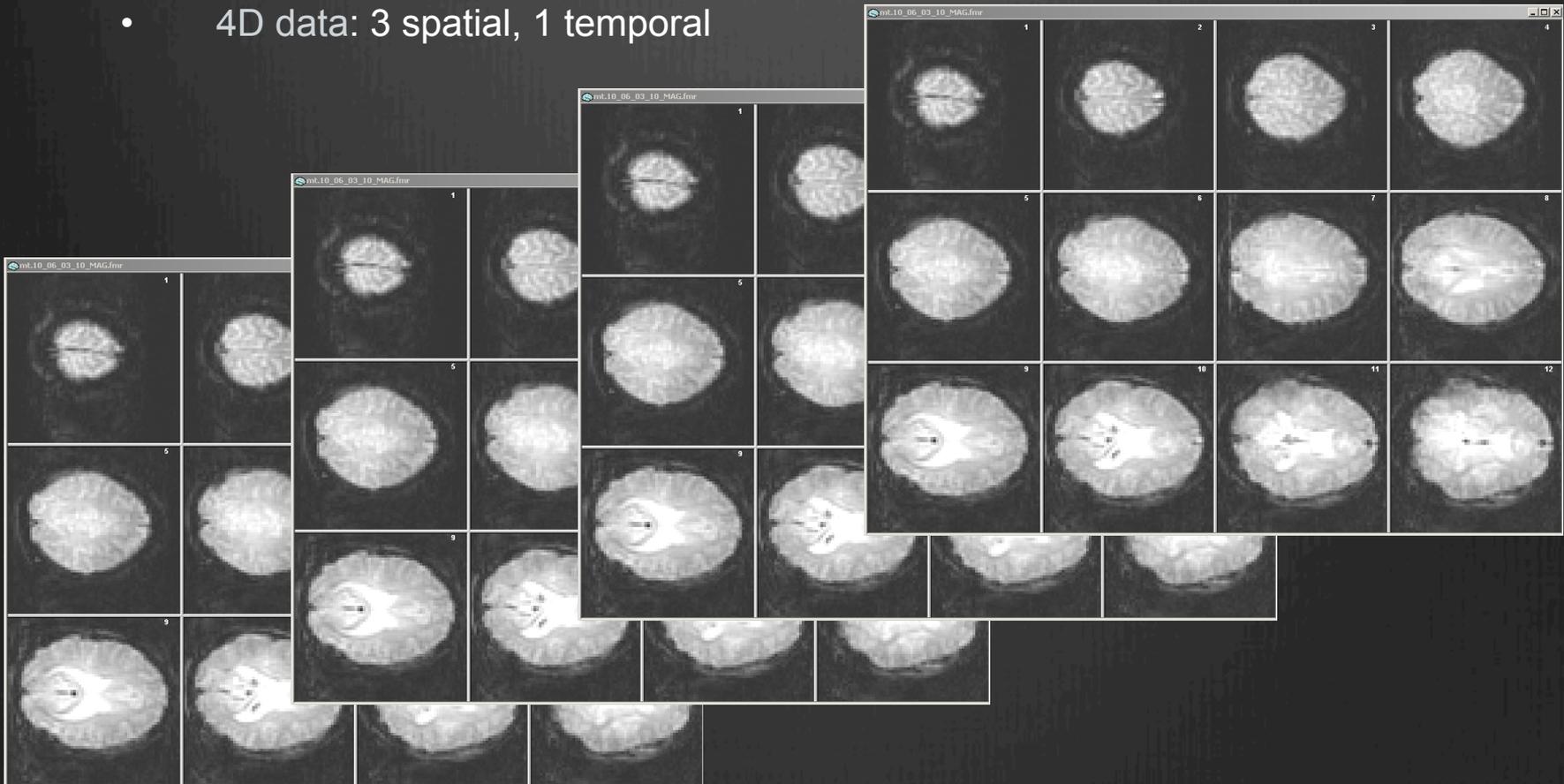


# fMRI Experiment Stages:

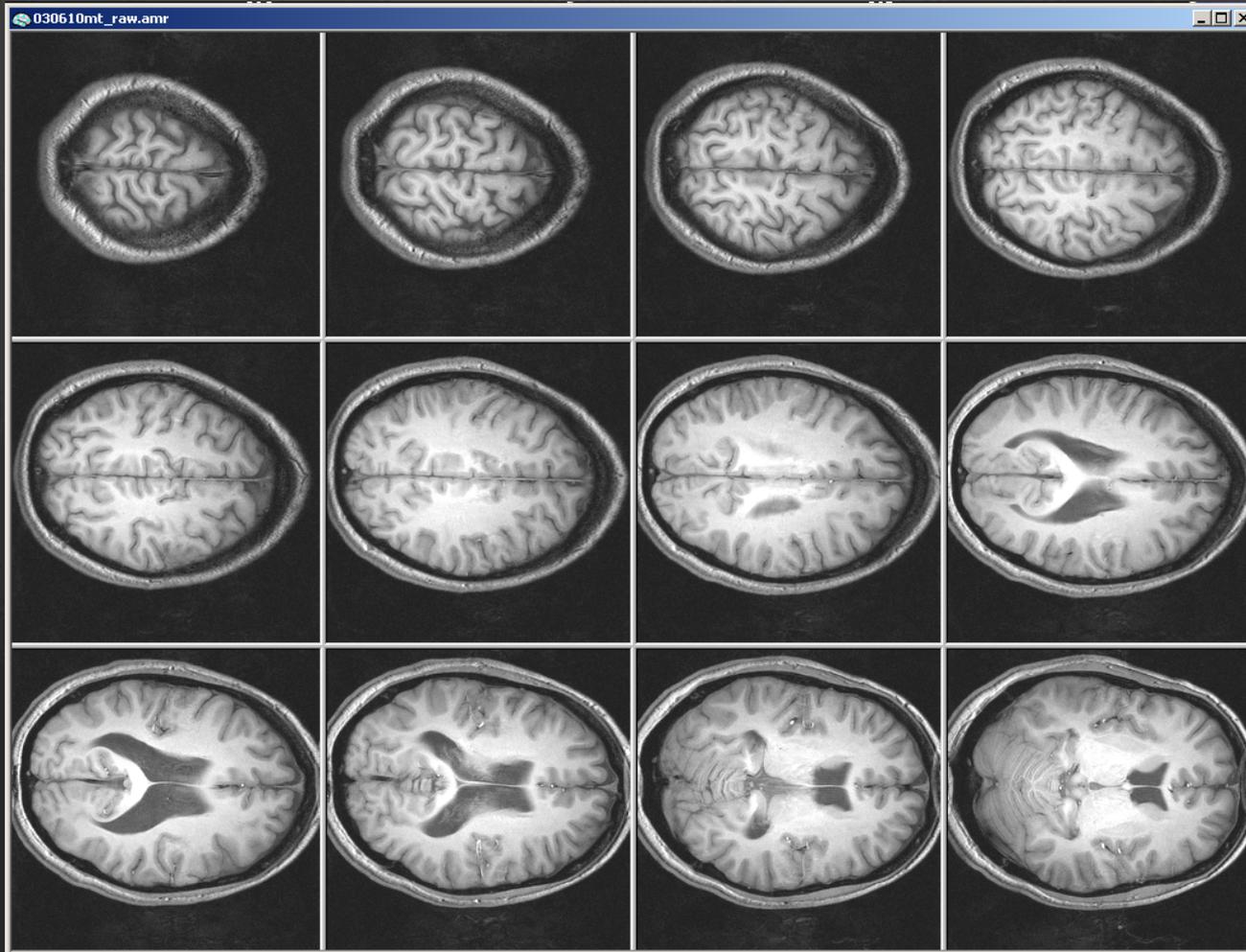
## Functionals

### 5) Take functional (T2\*) images

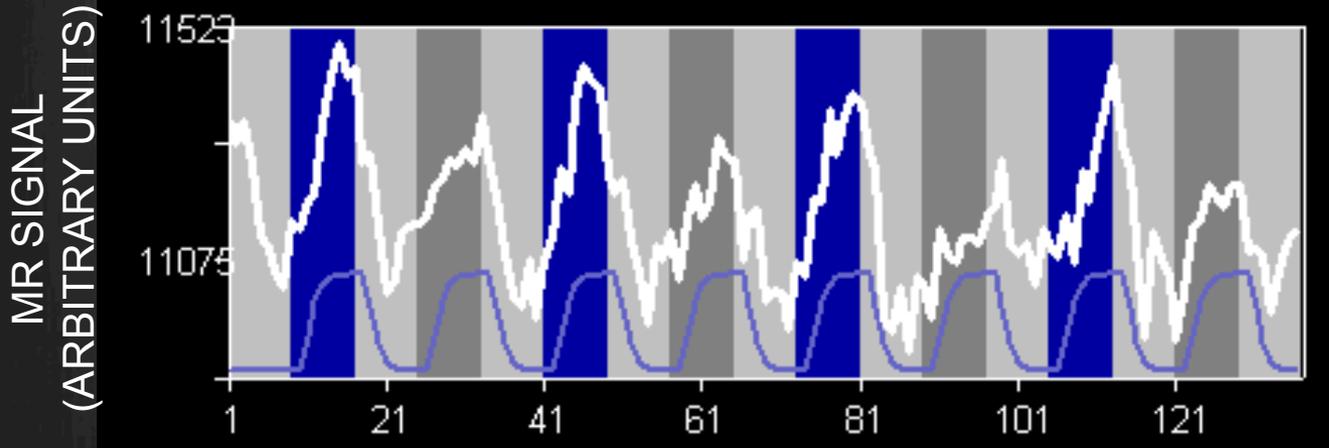
- images are indirectly related to neural activity
- usually low resolution images (3 x 3 x 6 mm)
- all slices at one time = a volume (sometimes also called an image)
- sample many volumes (time points) (e.g., 1 volume every 2 seconds for 136 volumes = 272 sec = 4:32)
- 4D data: 3 spatial, 1 temporal



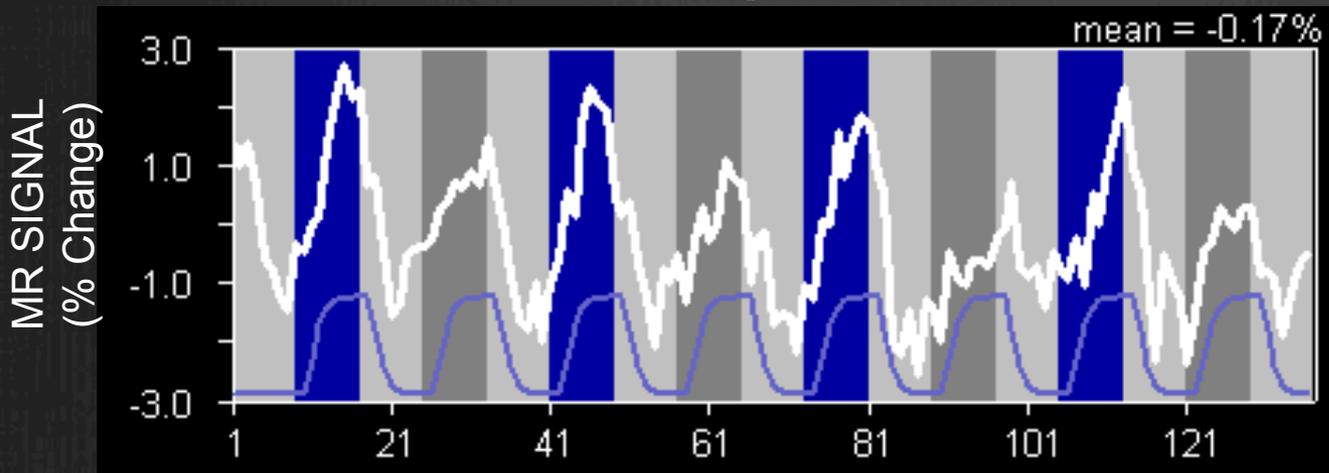
# Anatomic Slices Corresponding to Functional Slices



# Time Courses



Arbitrary signal varies from voxel to voxel, day to day, subject to subject



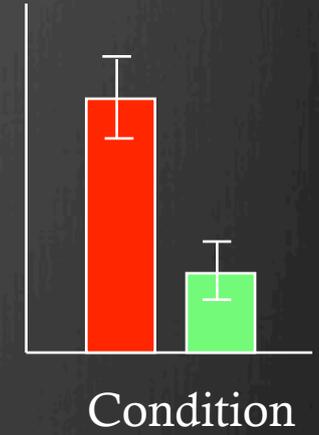
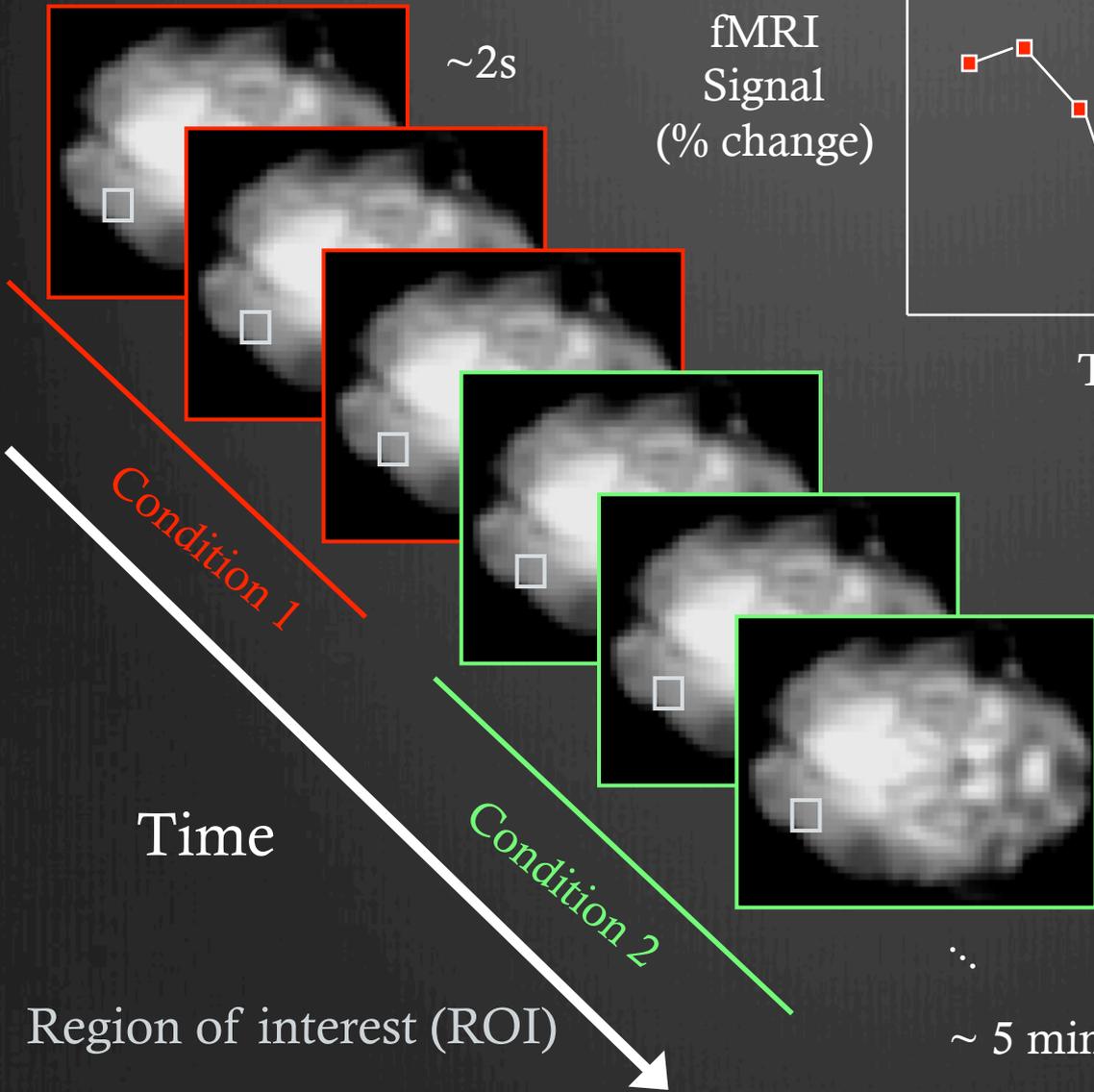
To make the y-axis more meaningful, we usually convert the signal into units of % change:

$$100 * (x - \text{baseline}) / \text{baseline}$$

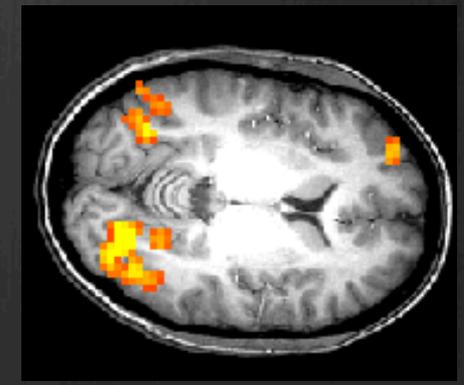
Changes are typically in the order of 0.5-4 %.

# Activation Statistics

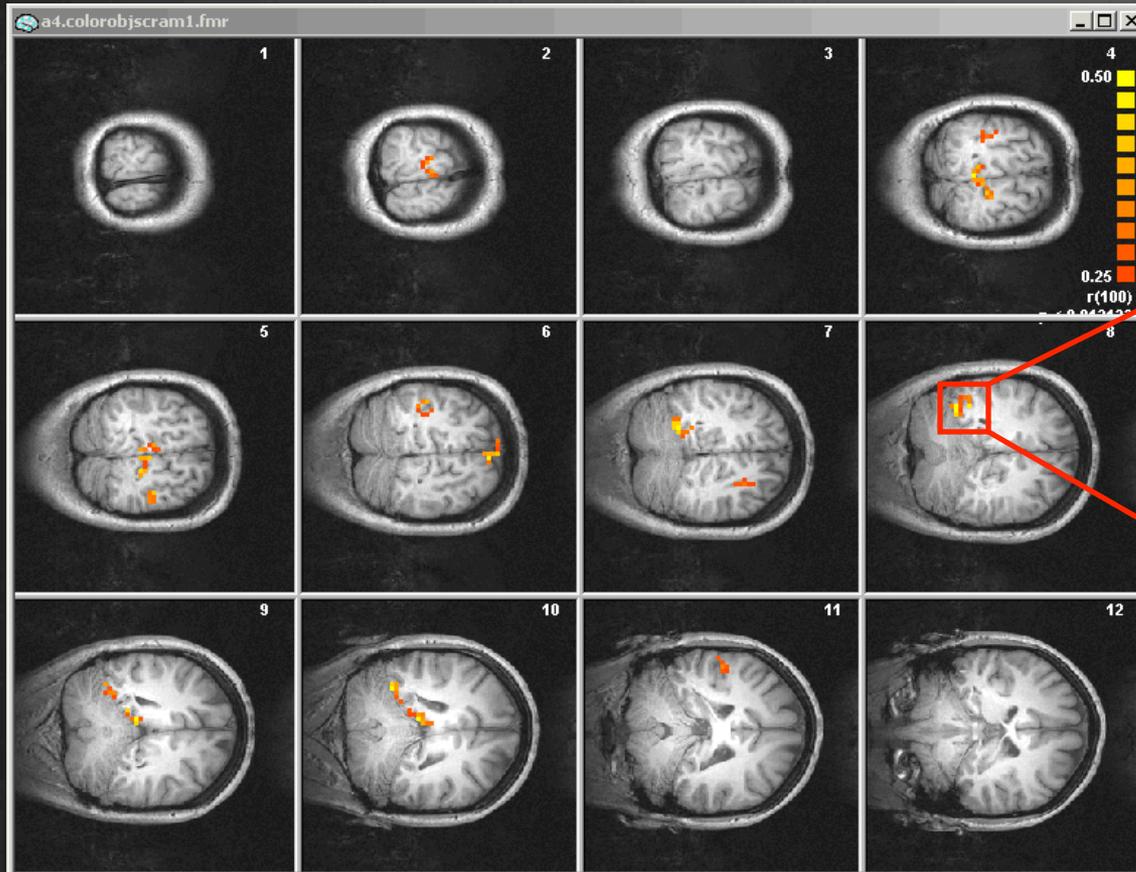
## Functional images



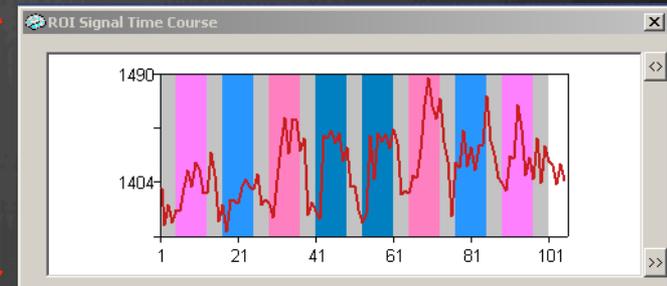
**Statistical Map**  
superimposed on  
anatomical MRI image



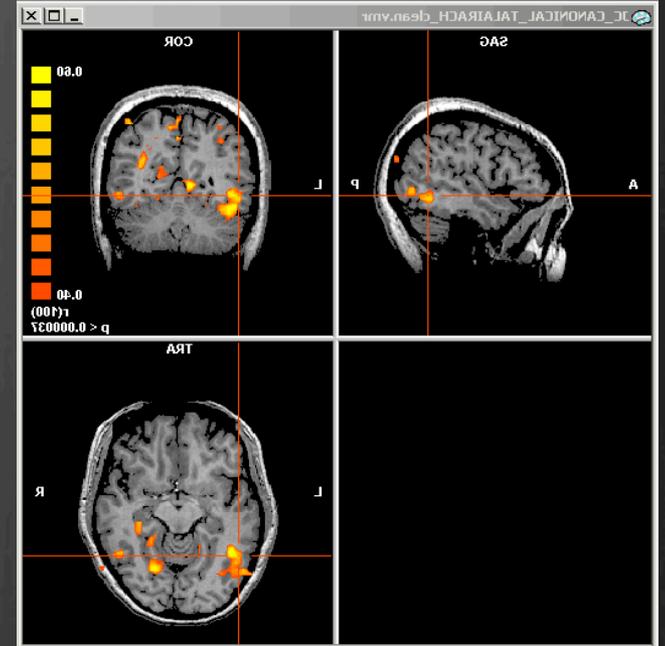
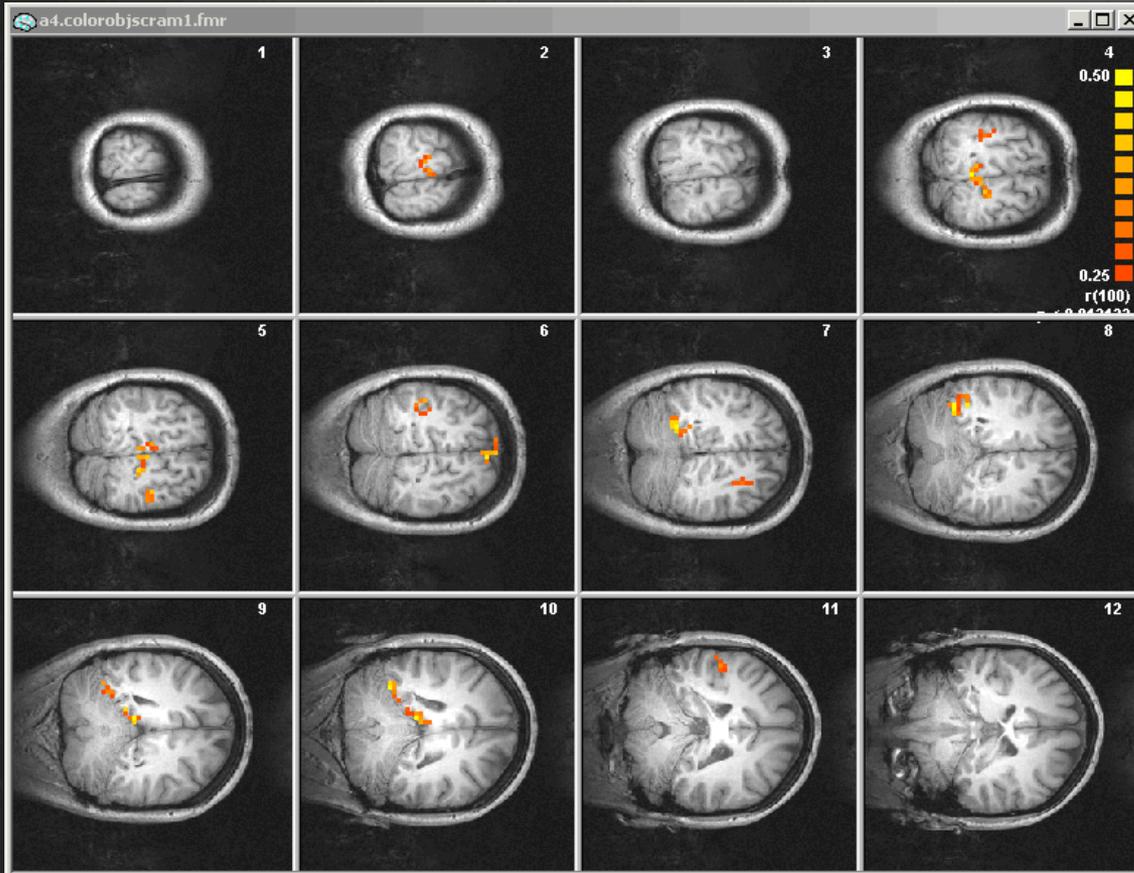
# Statistical Maps & Time Courses



Use stat maps to pick regions  
Then extract the time course



# 2D → 3D



# Design Jargon: Runs

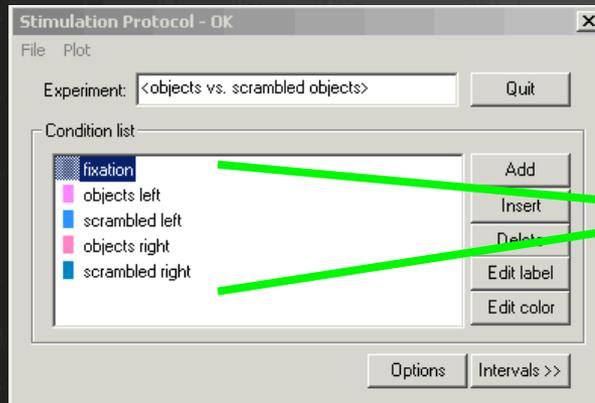
session: all of the scans collected from one subject in one day

run (or scan): one continuous period of fMRI scanning (~5-7 min)

experiment: a set of conditions you want to compare to each other

condition: one set of stimuli or one task

Note: Terminology can vary from one fMRI site to another (e.g., some places use “scan” to refer to what we’ve called a volume).



4 stimulus conditions  
+ 1 baseline condition (fixation)

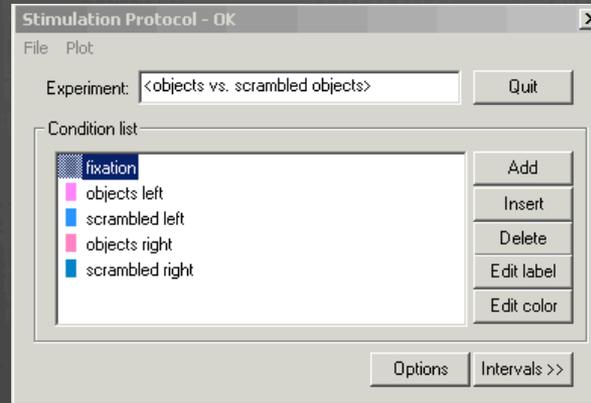
A session consists of one or more experiments.

Each experiment consists of several (e.g., 1-8) runs

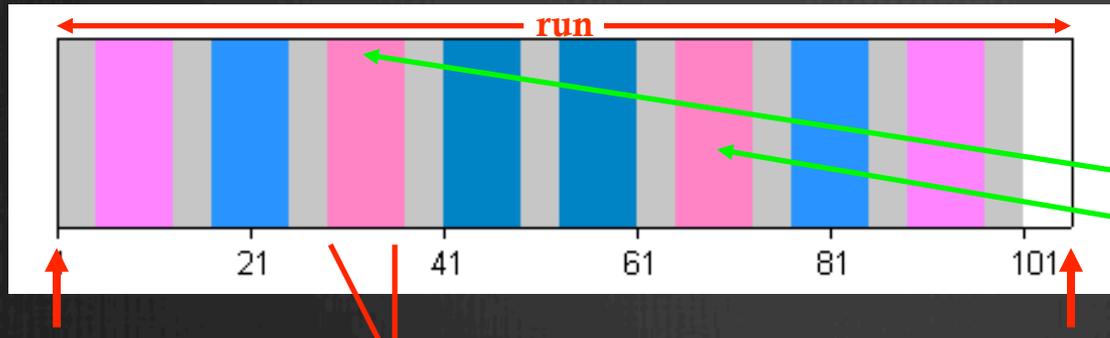
More runs/expt are needed when signal:noise is low or the effect is weak.

Thus each session consists of numerous (e.g., 5-20) runs (e.g., 0.5 – 3 hours)

# Design Jargon: Paradigm



paradigm (or protocol): the set of conditions and their order used in a particular run

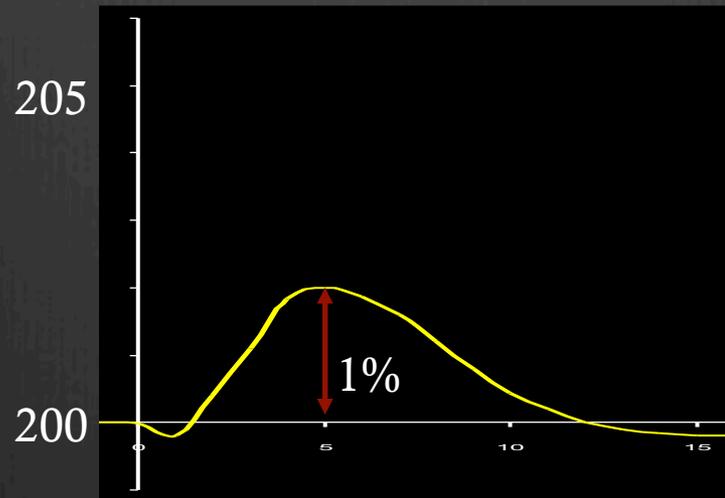
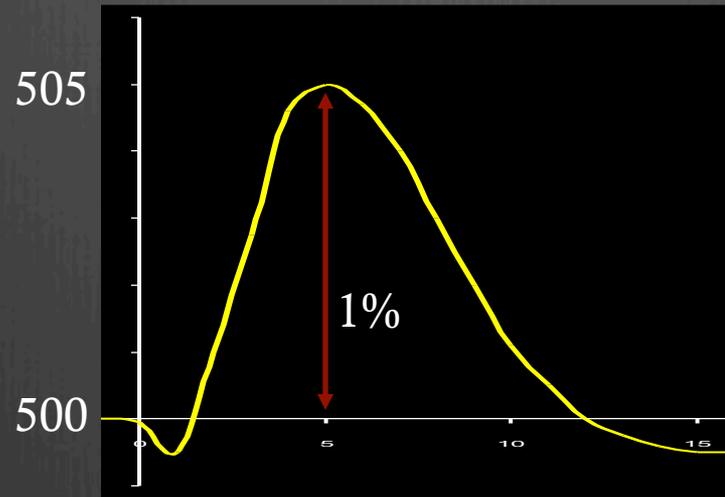


epoch: one instance of a condition  
first "objects right" epoch  
second "objects right" epoch

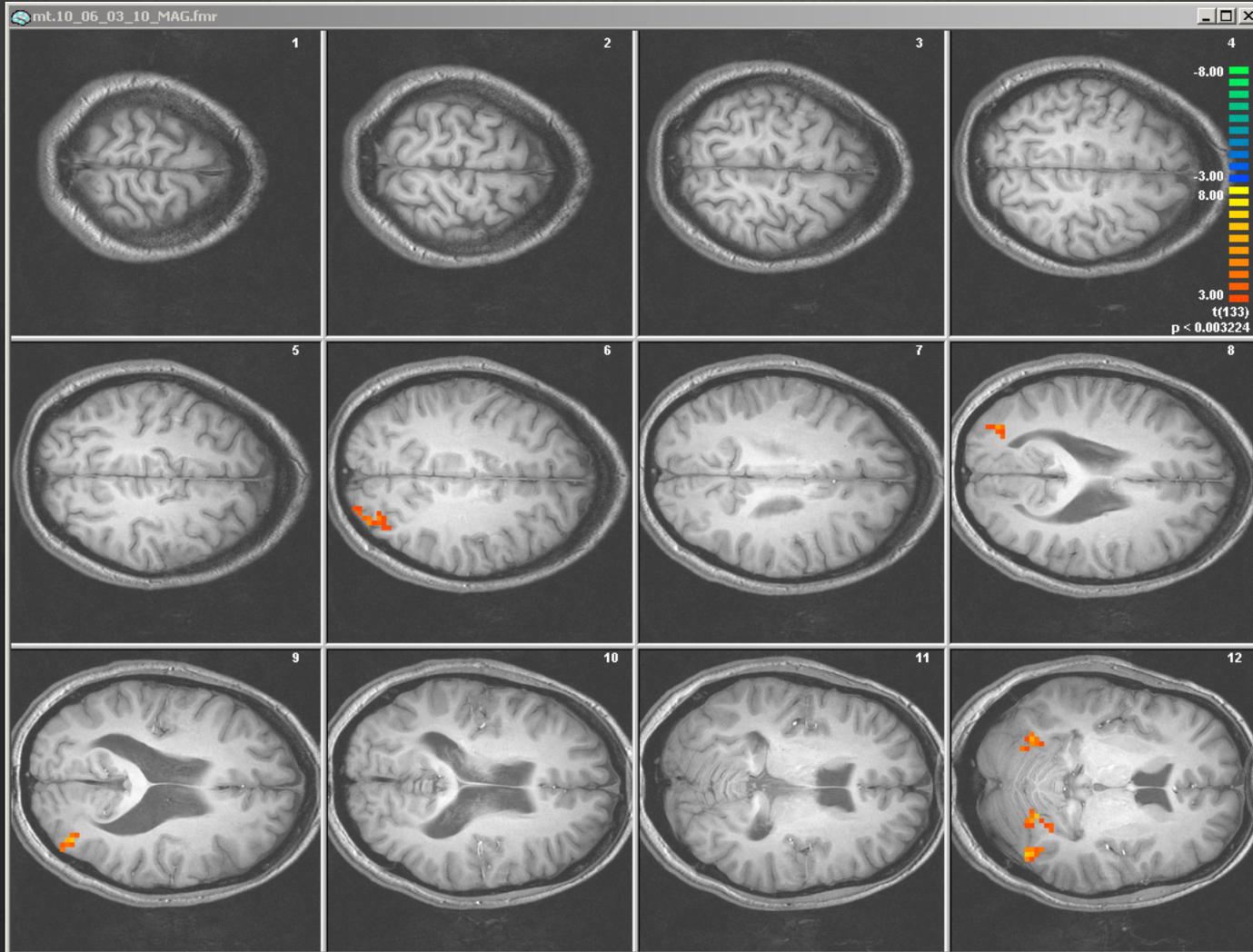
volume #1 (time = 0)      epoch      volume #105  
8 vol x 2 sec/vol = 16 sec      (time = 105 vol x 2 sec/vol = 210 sec = 3:30)

Time

# Percent Signal Change



# Stats on Anatomical



# 2D → 3D

