

# Strategies for Information Extraction and Artifact Reduction in Functional MRI

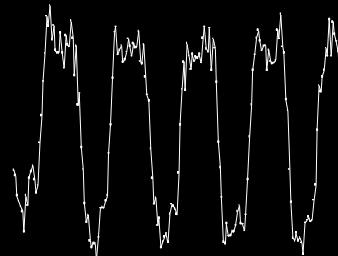
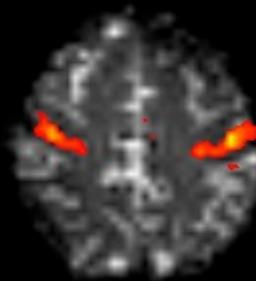
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&  
3T Neuroimaging Core Facility

Laboratory of Brain and Cognition  
National Institute of Mental Health

# Categories of Questions Asked with fMRI

Where?



When?

How much?

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**How to get the brain to do what we want it to do in the context of an fMRI experiment?**

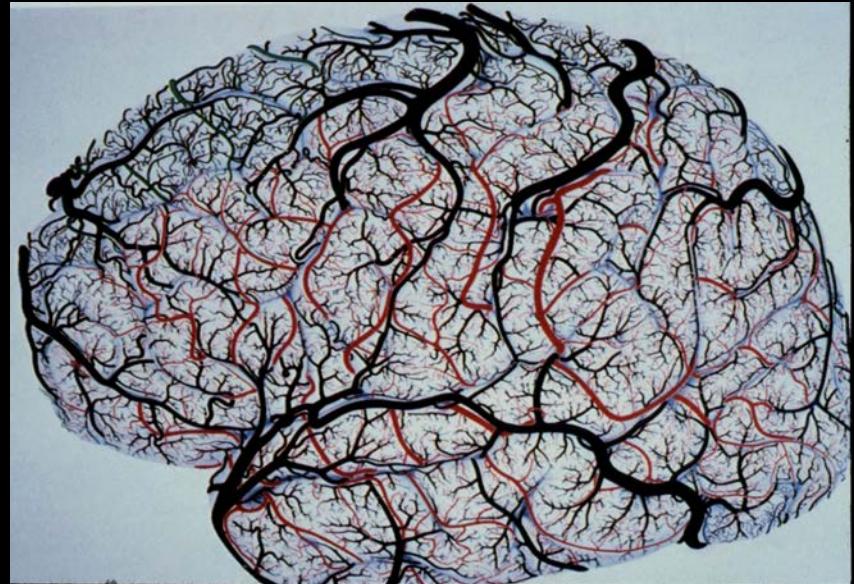
*(limitations: limited time and signal to noise, motion, acoustic noise)*

# A Primary Challenge:

...to make progressively more precise inferences using fMRI without making too many assumptions about non-neuronal physiologic factors.

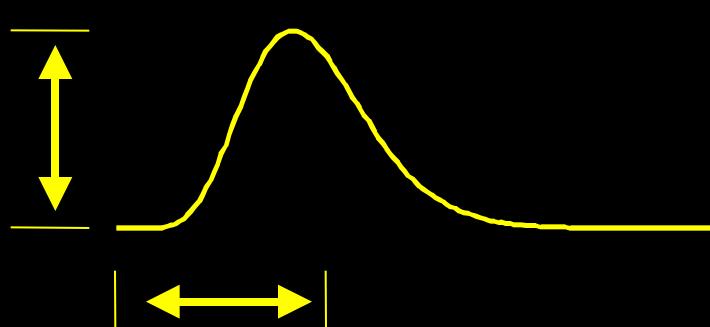


FIG. 43. Middle temporal gyrus. Female, 60 years. (1) Principal intracortical vein. The branches length regularly decreases from deep to superficial cortical regions, thus the vascular territory of the principal vein has a conical appearance (dotted line) ( $\times 28$ )



**Neuronal  
Activation**

**Measured  
fMRI  
Signal**

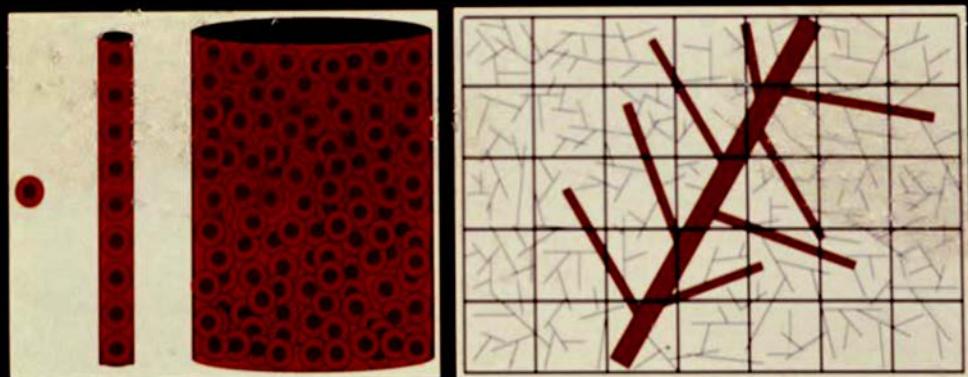


**Physiologic Factors**

# Physiologic Factors that Influence BOLD Contrast

- Blood oxygenation
- Blood volume
- Blood pressure
- Hematocrit
- Vessel size

Coupling:  
Flow & CMRO<sub>2</sub>

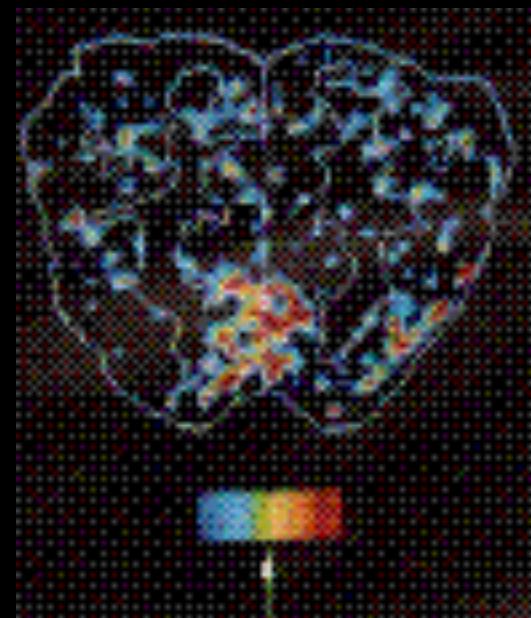
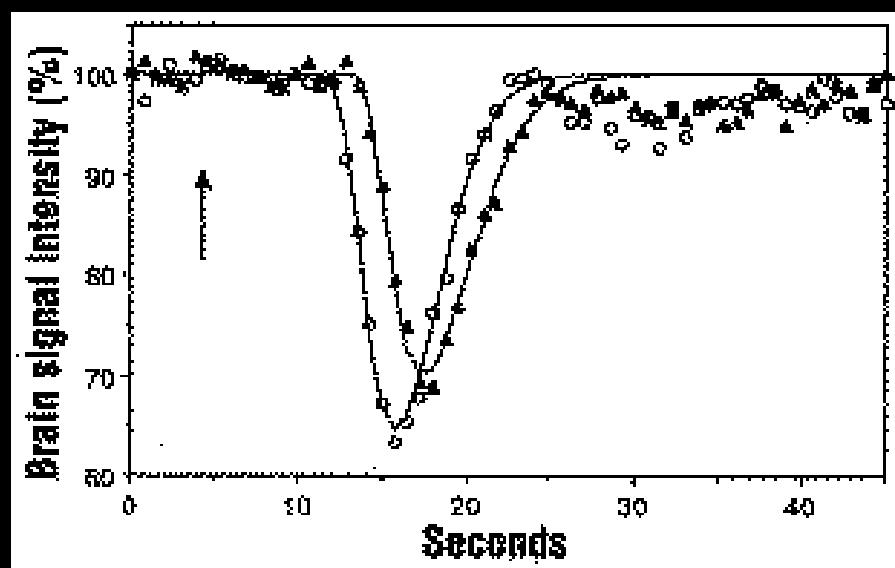
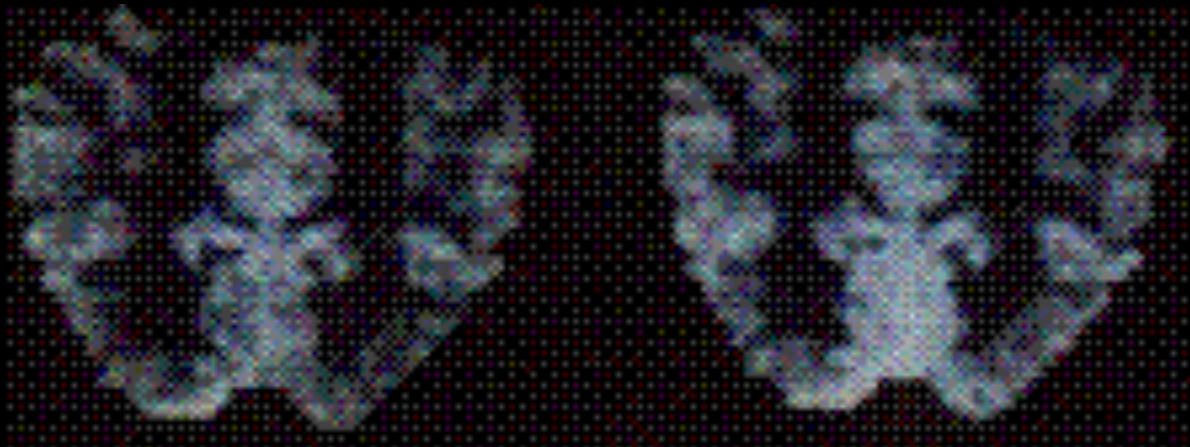


# Contrast in Functional MRI

- **Blood Volume**
  - Contrast agent injection and time series collection of T2\* or T2 - weighted images
- **BOLD**
  - Time series collection of T2\* or T2 - weighted images
- **Perfusion**
  - T1 weighting
  - Arterial spin labeling

**Resting**

**Active**

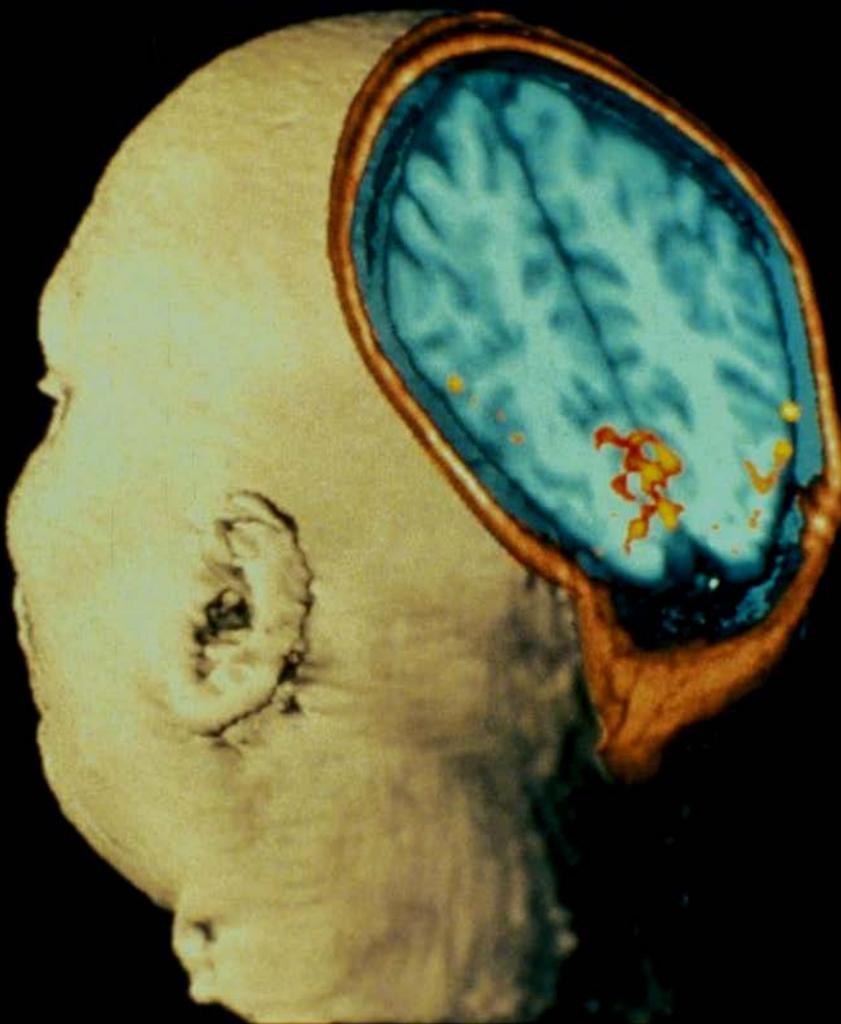


# Photic Stimulation

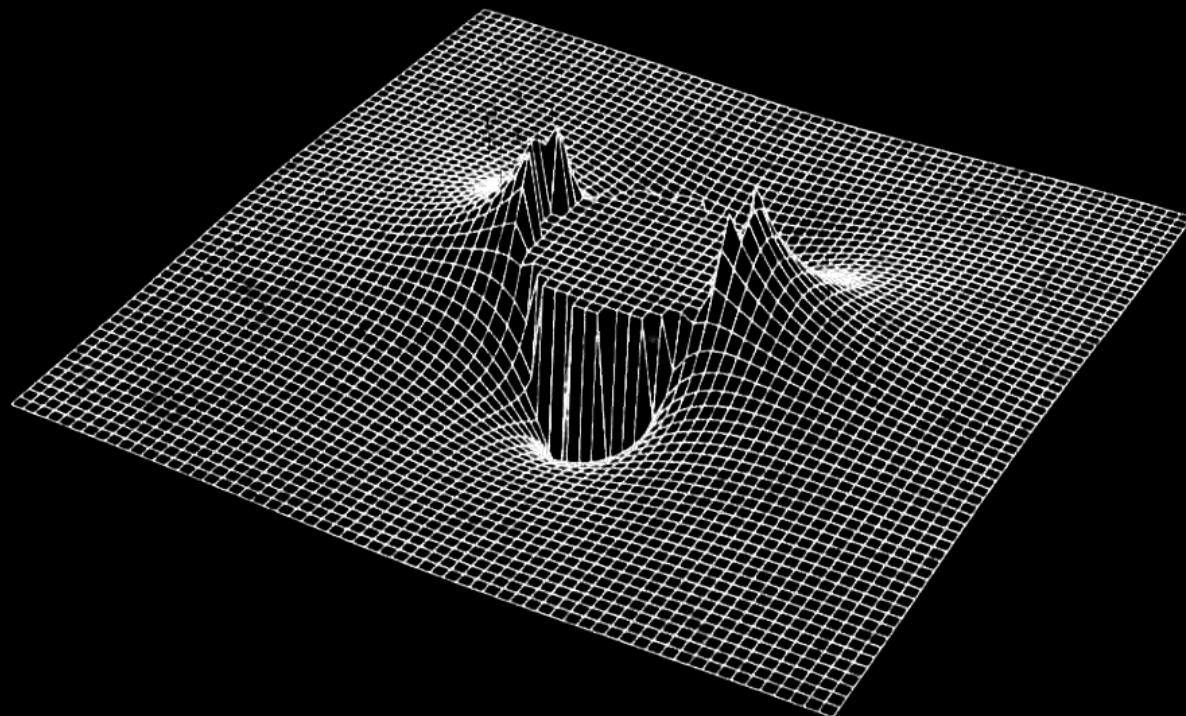
MRI Image showing  
activation of the  
Visual Cortex

From Belliveau, et al.  
Science Nov 1991

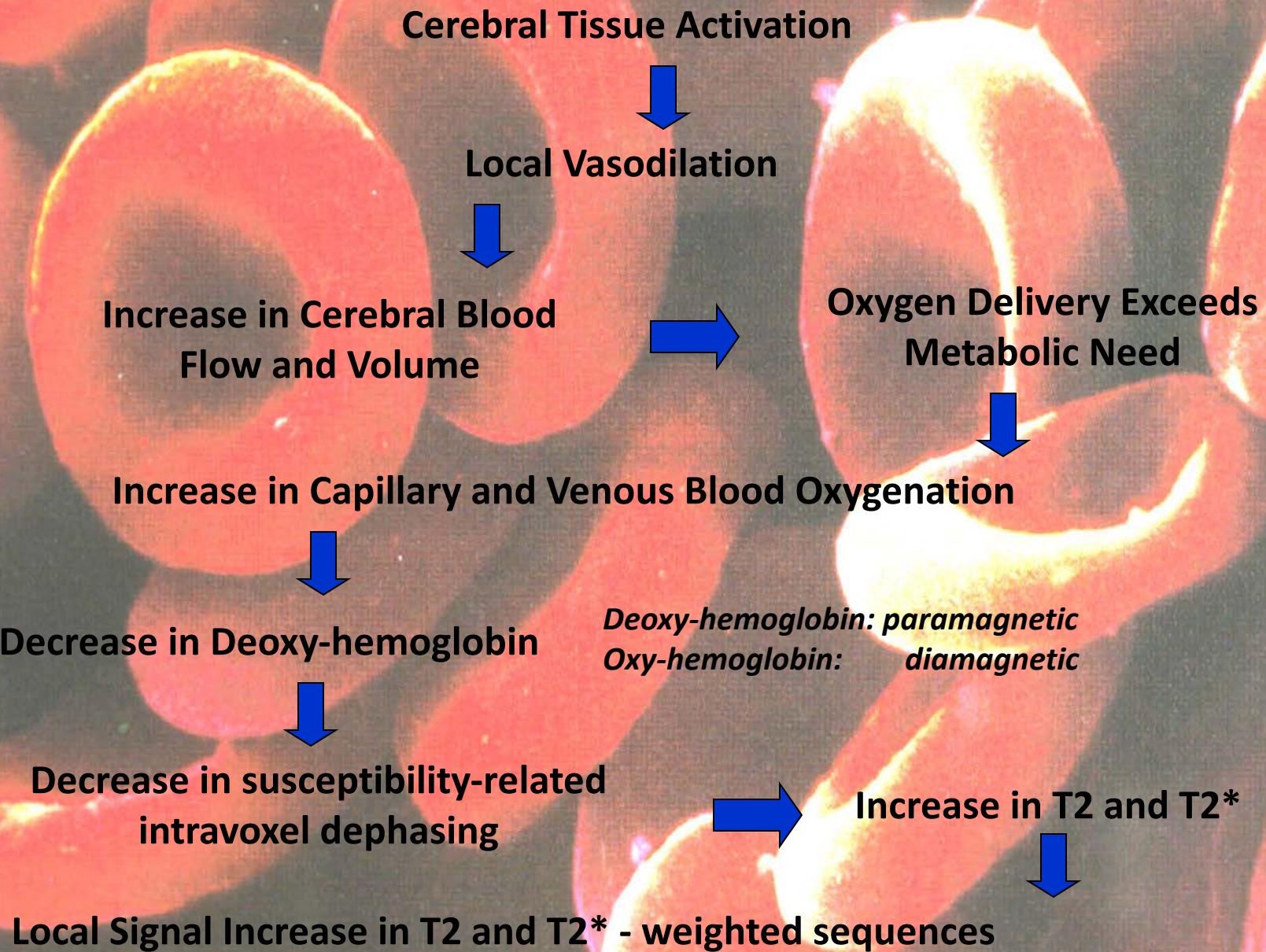
MSC - perfusion



Susceptibility-Induced Field Distortion in the  
Vicinity of a Microvessel  $\perp$  to  $B_0$ .

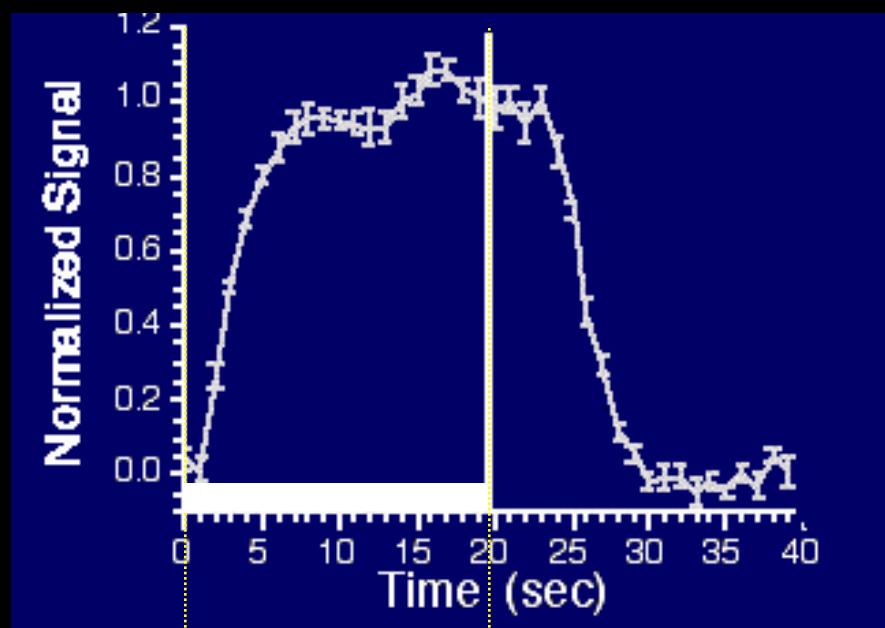


# BOLD Contrast in the Detection of Neuronal Activity

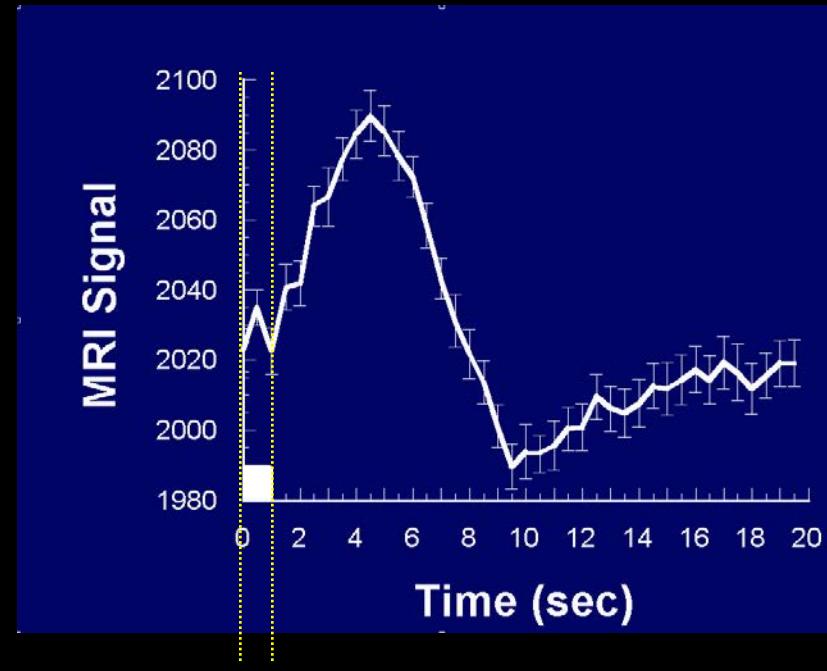


# The BOLD Signal

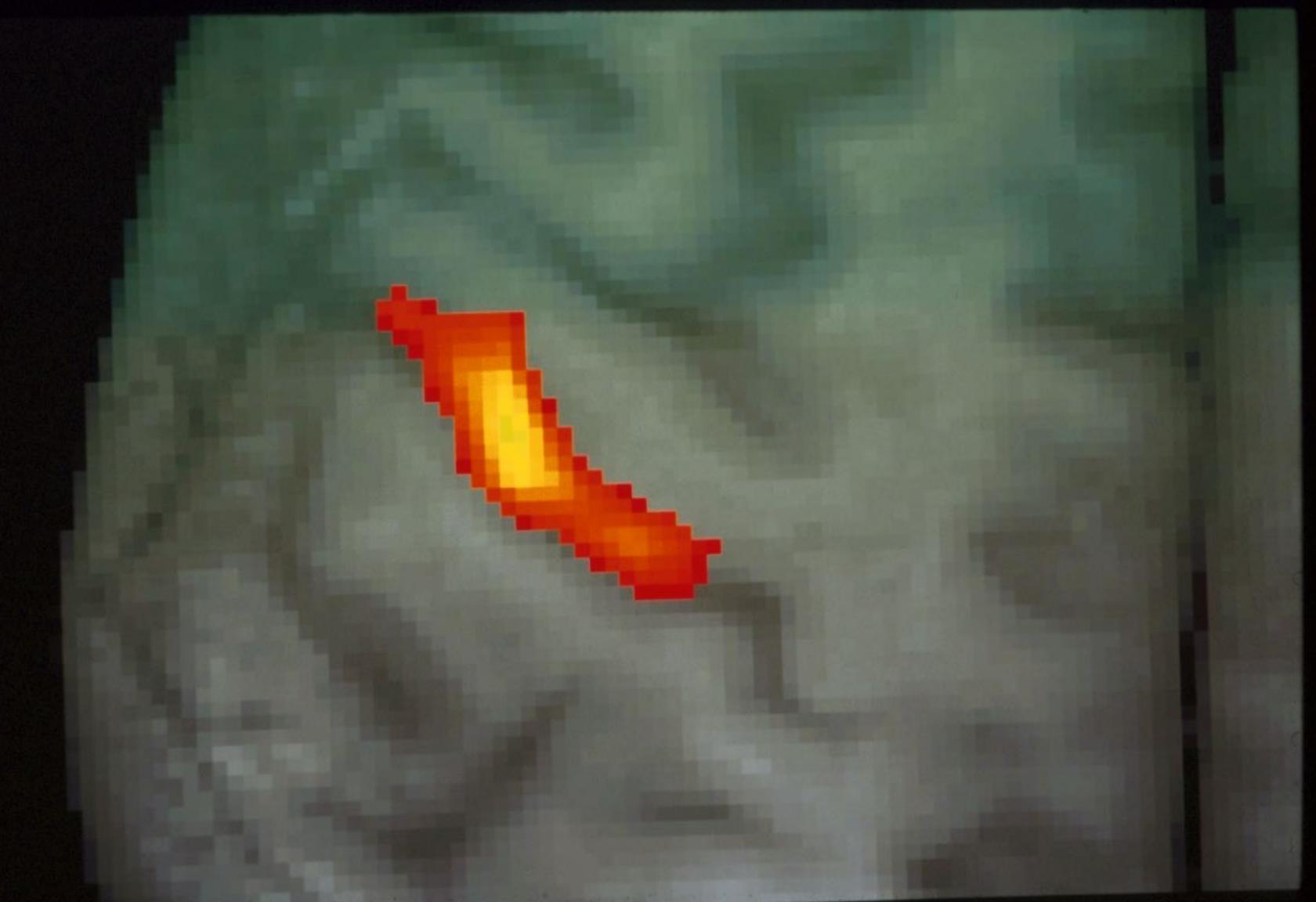
Blood Oxxygenation Level Dependent (BOLD) signal changes



*task*



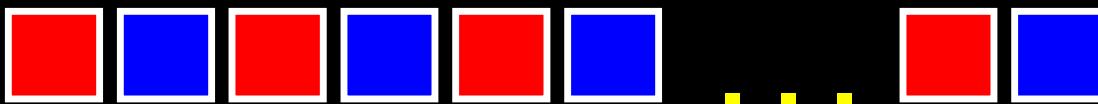
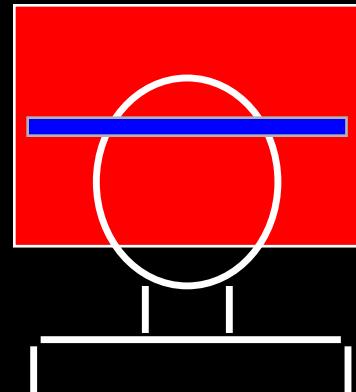
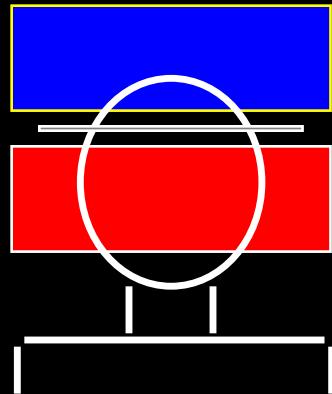
*task*



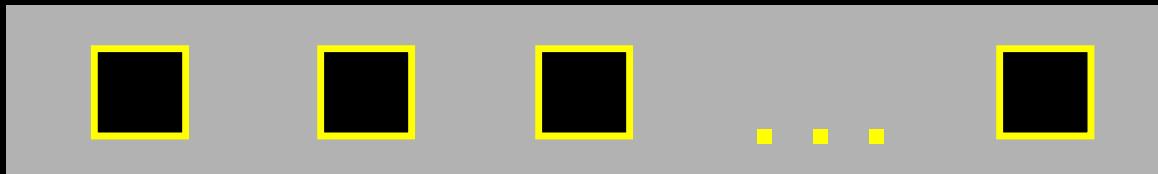
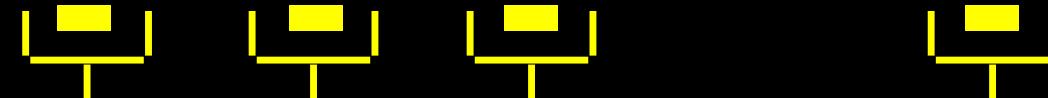
# Perfusion / Flow Imaging

EPISTAR

FAIR



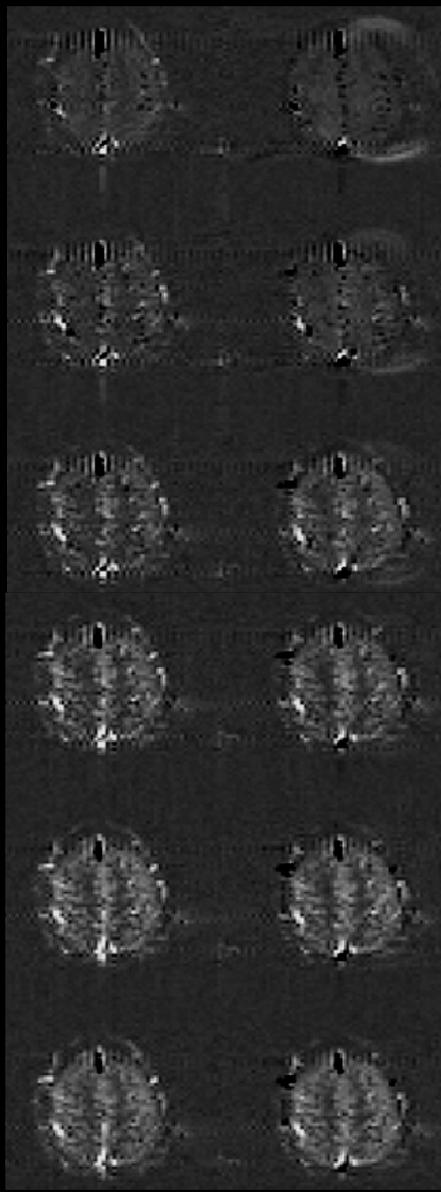
...



Perfusion  
Time Series

**TI (ms) FAIR EPISTAR**

**200**



**400**

**600**

**800**

**1000**

**1200**

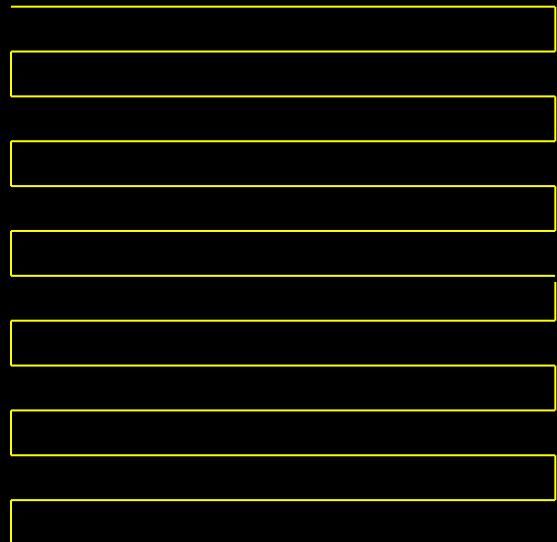
# **Scanner and Hemodynamic Limits**

# Single Shot Imaging

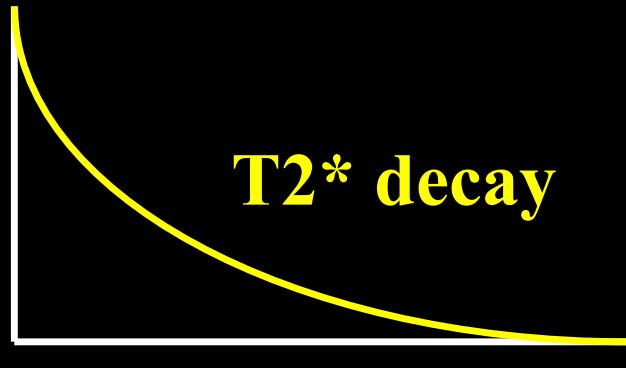


EPI Readout Window

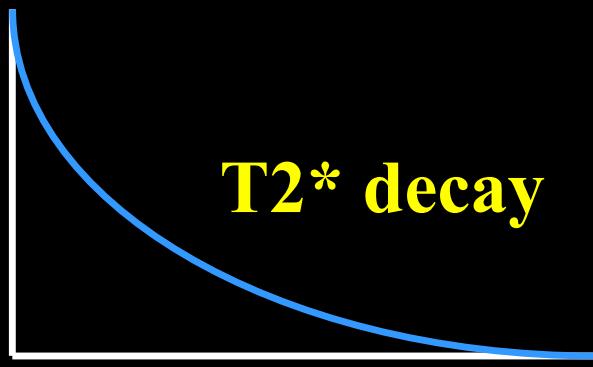
$\approx 20$  to 40 ms



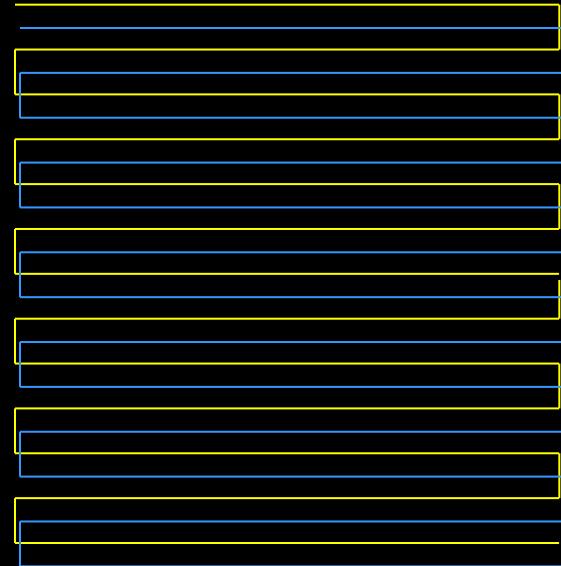
# Multishot Imaging



EPI Window 1



EPI Window 2



# Multi Shot EPI

Excitations

1

2

4

8

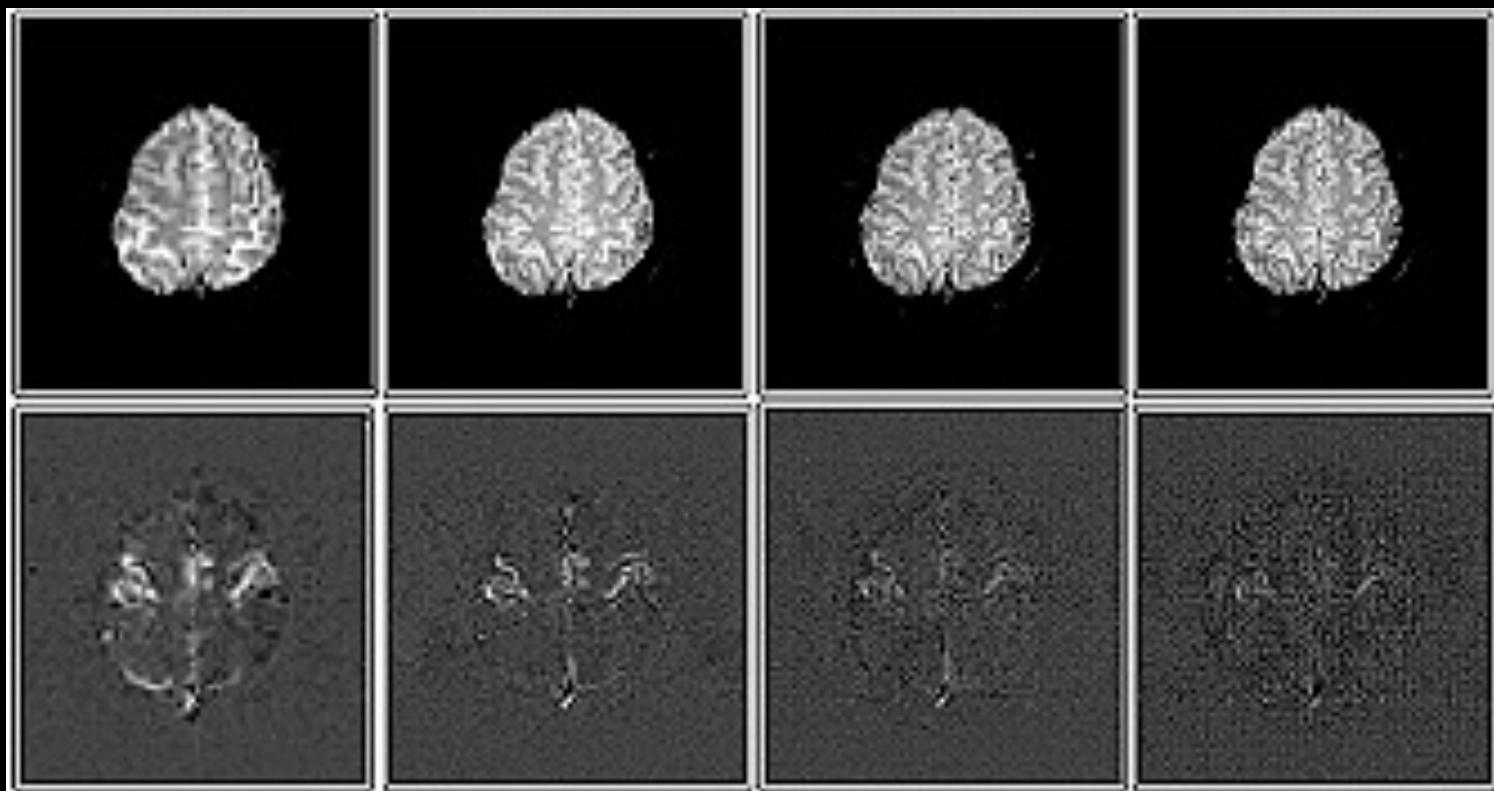
Matrix Size

64 x 64

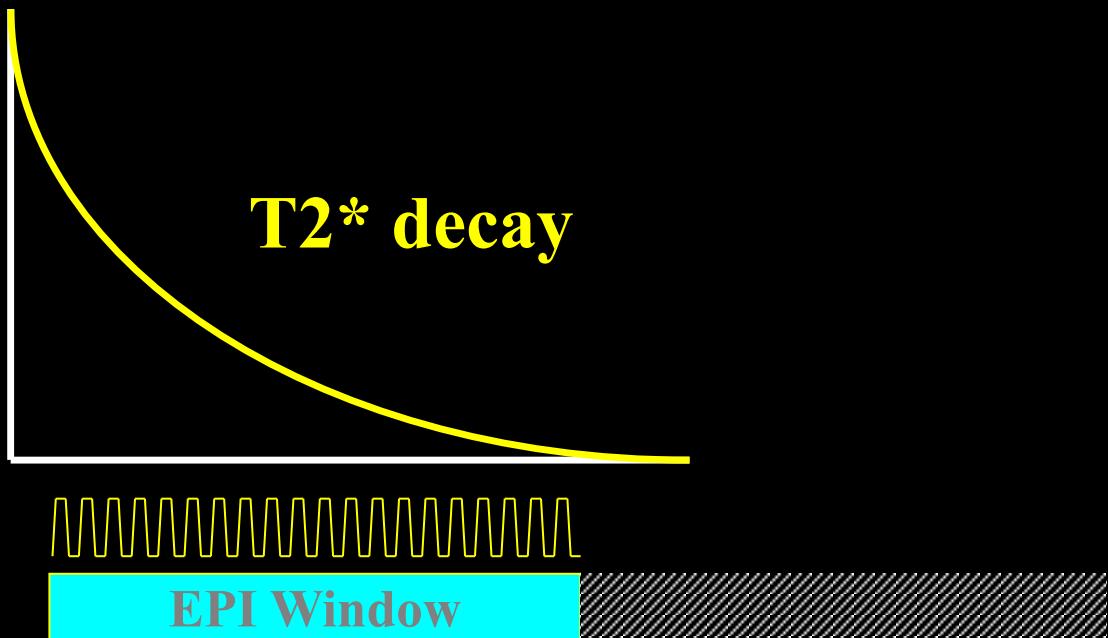
128 x 128

256 x 128

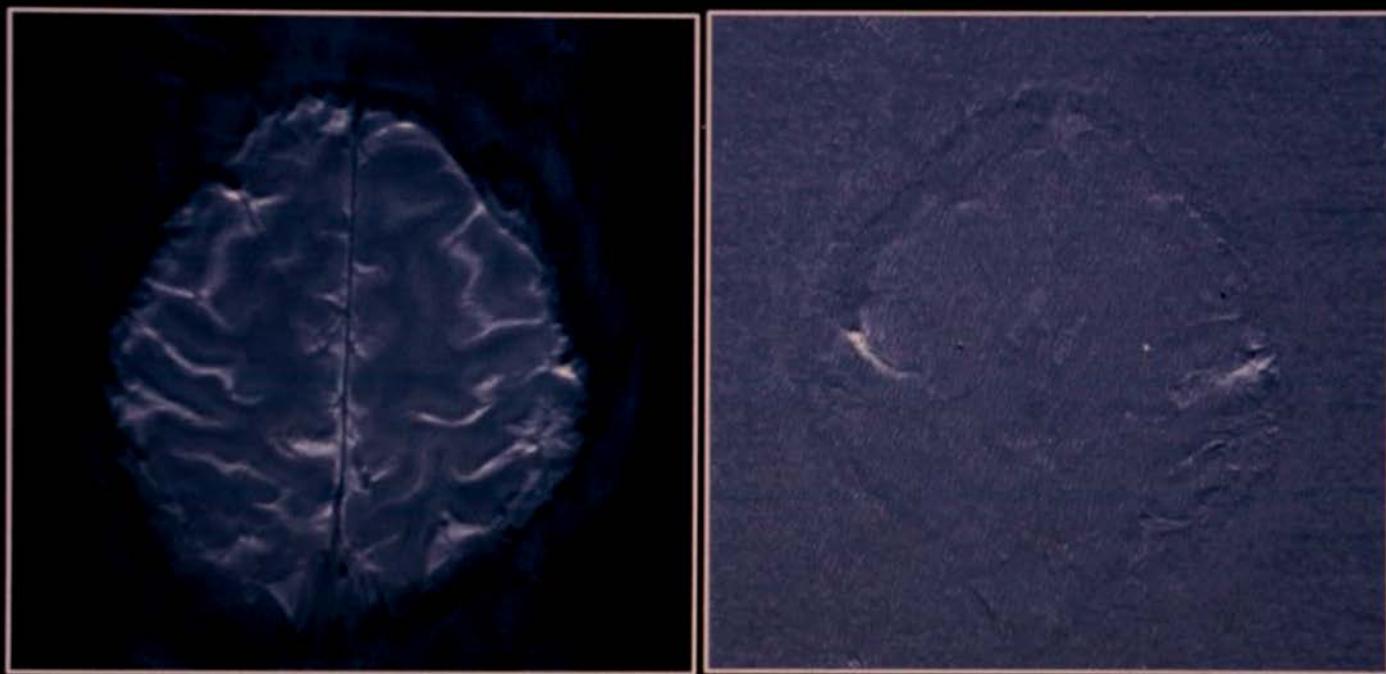
256



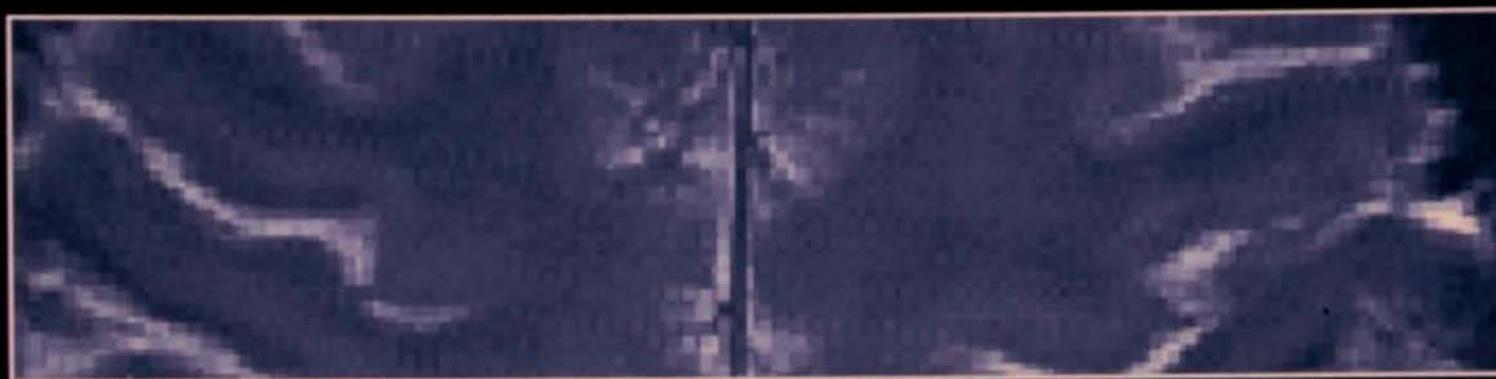
# Partial k-space imaging



**Single - Shot EPI at 3T:  
Half NEX, 256 x 256, 16 cm FOV**

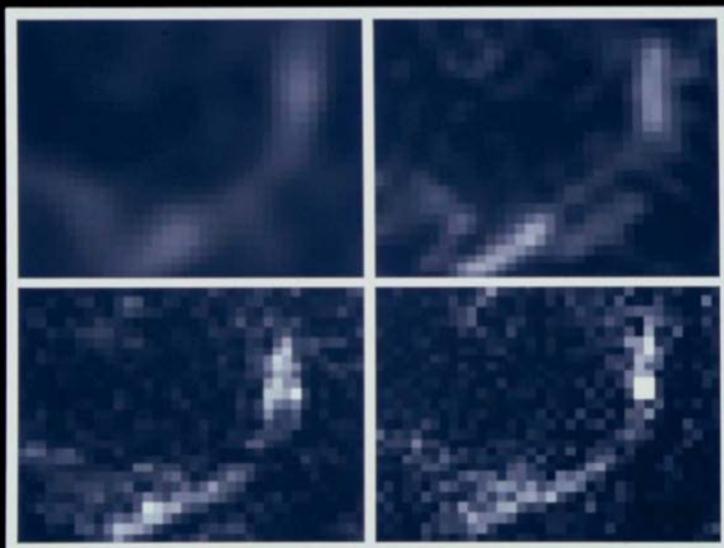


**Single - Shot EPI at 3T:  
Half NEX 256 x 256, 16 cm FOV**



## Fractional Signal Change

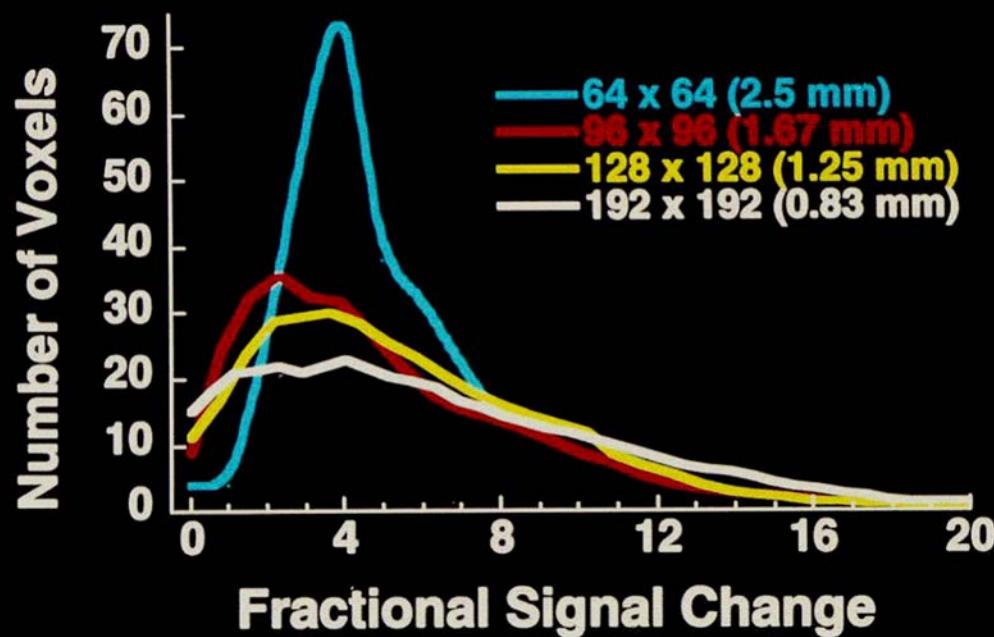
$2.5 \text{ mm}^2$



$1.25 \text{ mm}^2$

$0.83 \text{ mm}^2$

$0.62 \text{ mm}^2$

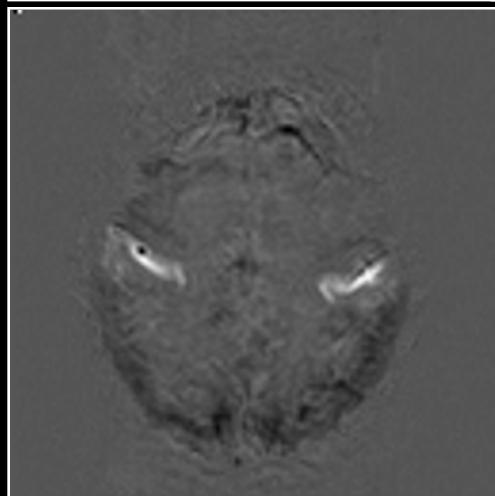
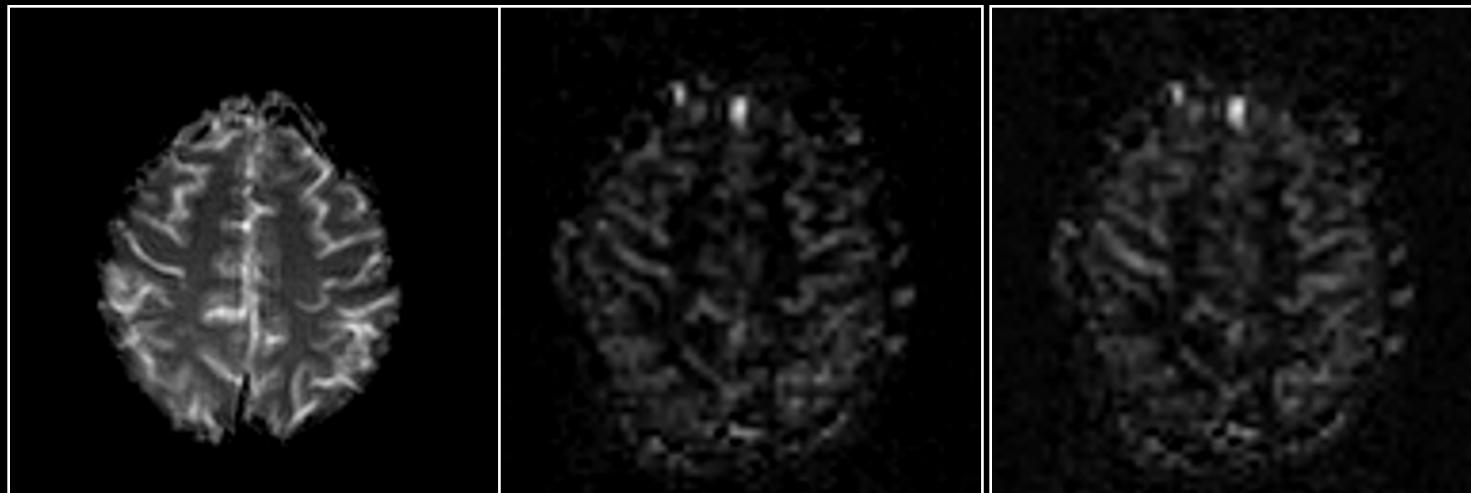


# Perfusion

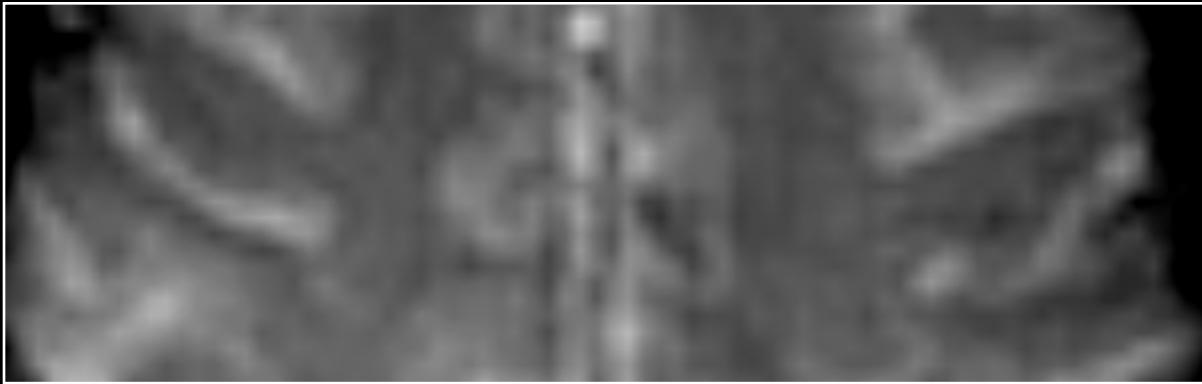
**BOLD**

*Rest*

*Activation*



# Anatomy



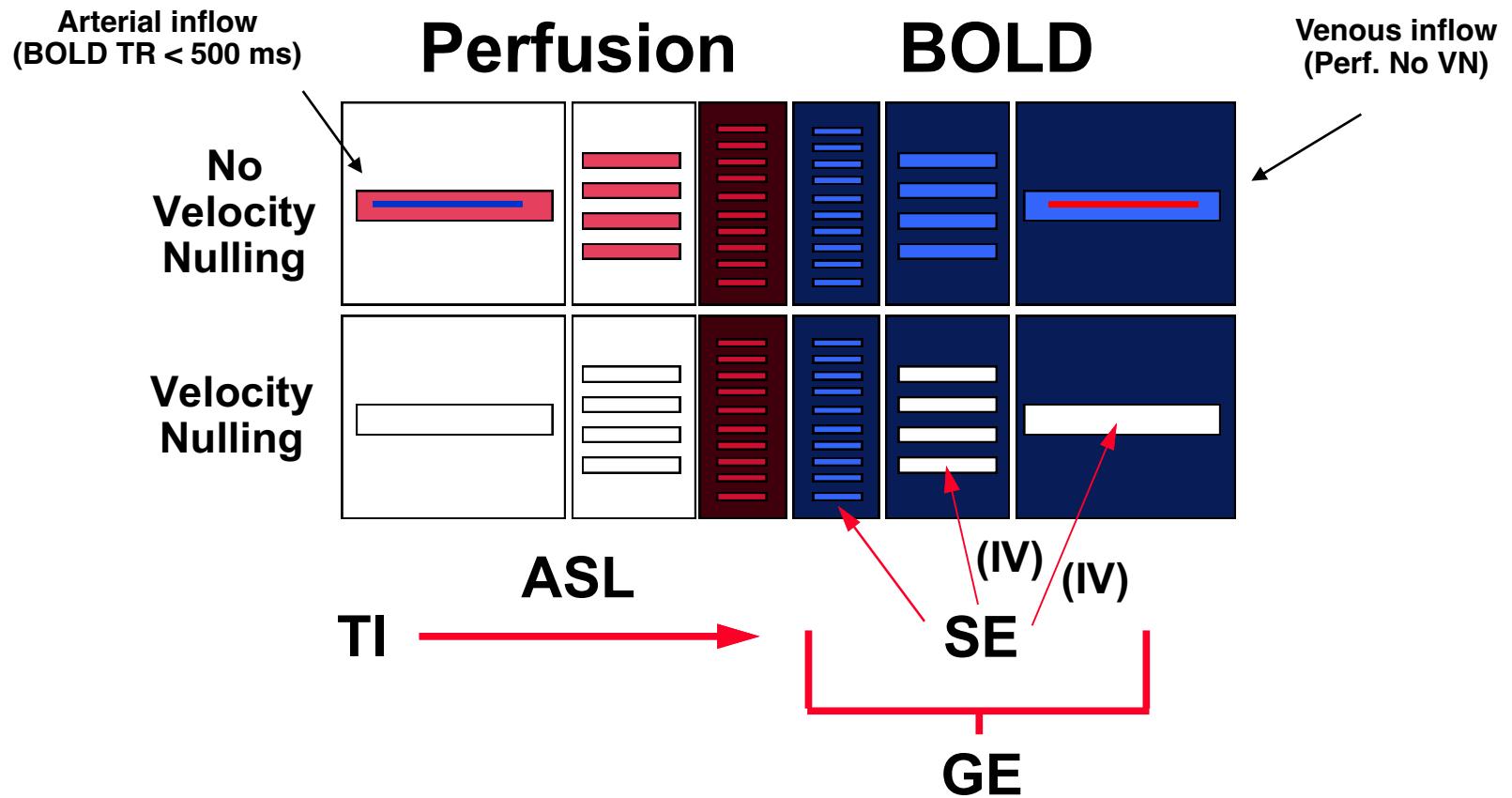
# BOLD



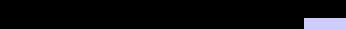
# Perfusion



# Hemodynamic Specificity



## Volume



- unique information
- baseline information
- multislice trivial

- invasive
- low C / N for func.

## BOLD

- highest C / N
- easy to implement
- multislice trivial
- non invasive
- highest temp. res.

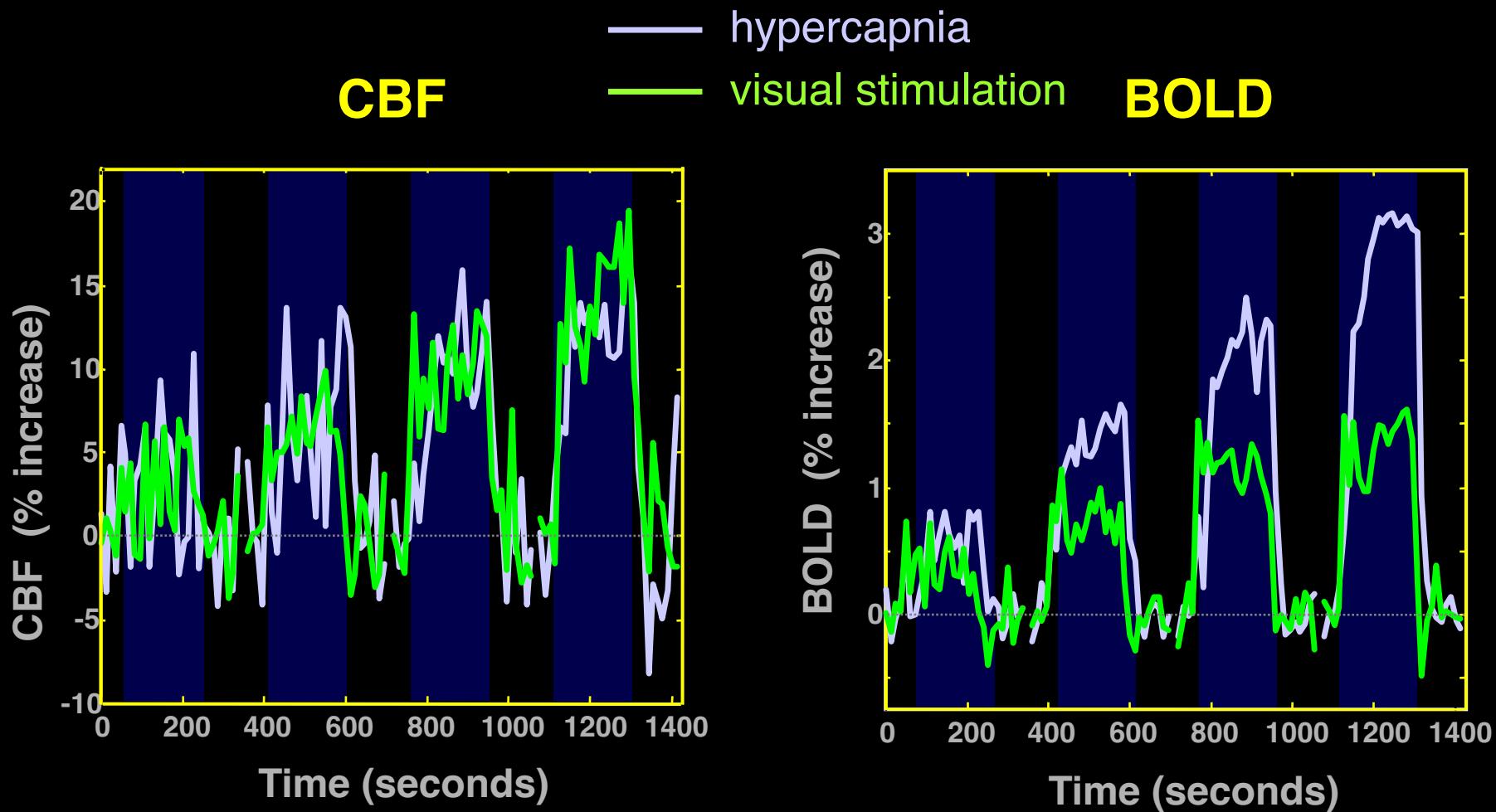
- complicated signal
- no baseline info.

## Perfusion

- unique information
- control over ves. size
- baseline information
- non invasive

- multislice non trivial
- lower temp. res.
- low C / N

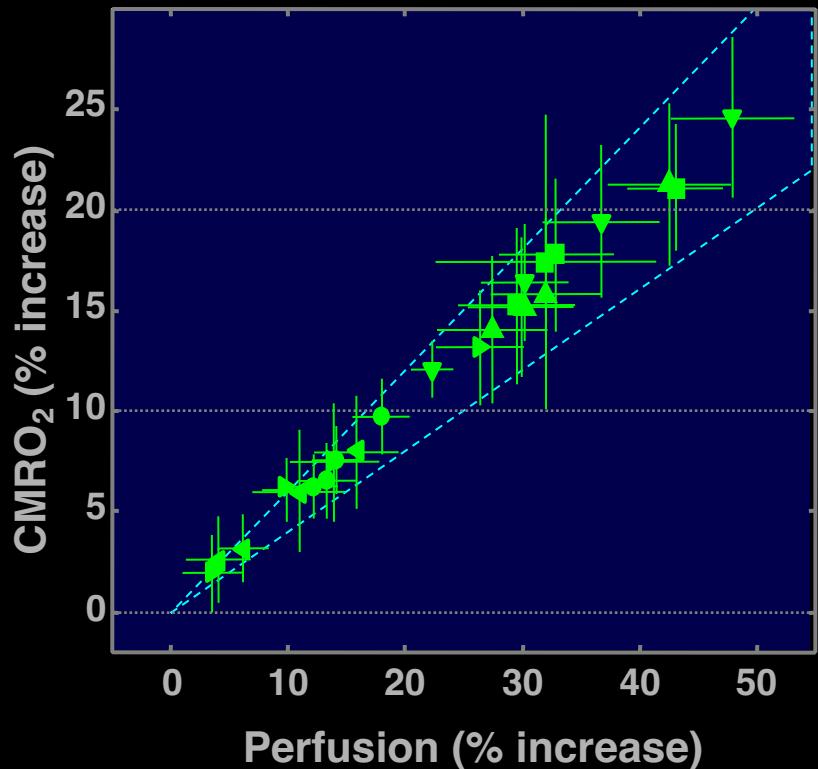
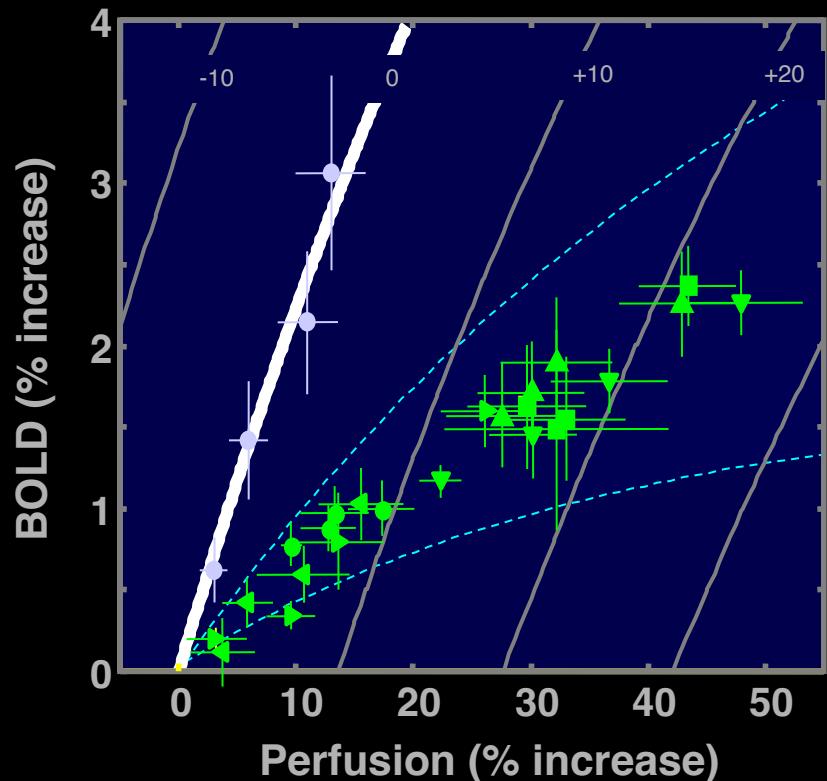
# CMRO<sub>2</sub>-related BOLD signal deficit:



Simultaneous Perfusion and BOLD imaging  
during graded visual activation and hypercapnia

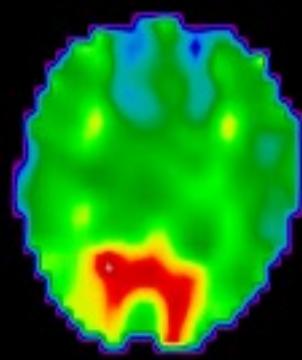
N=12

# CBF-CMRO<sub>2</sub> coupling

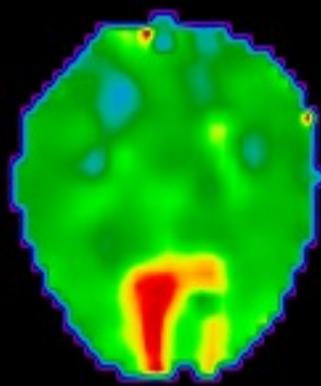


**Characterizing Activation-induced CMRO<sub>2</sub> changes using calibration with hypercapnia**

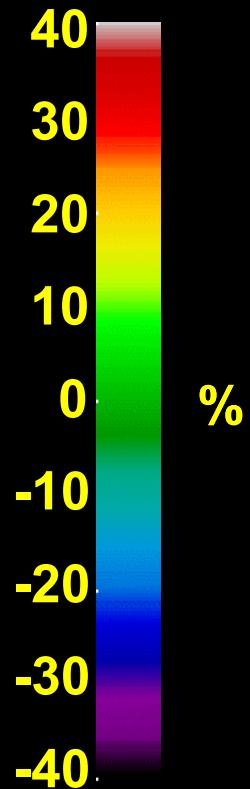
# Computed CMRO<sub>2</sub> changes



**Subject 1**

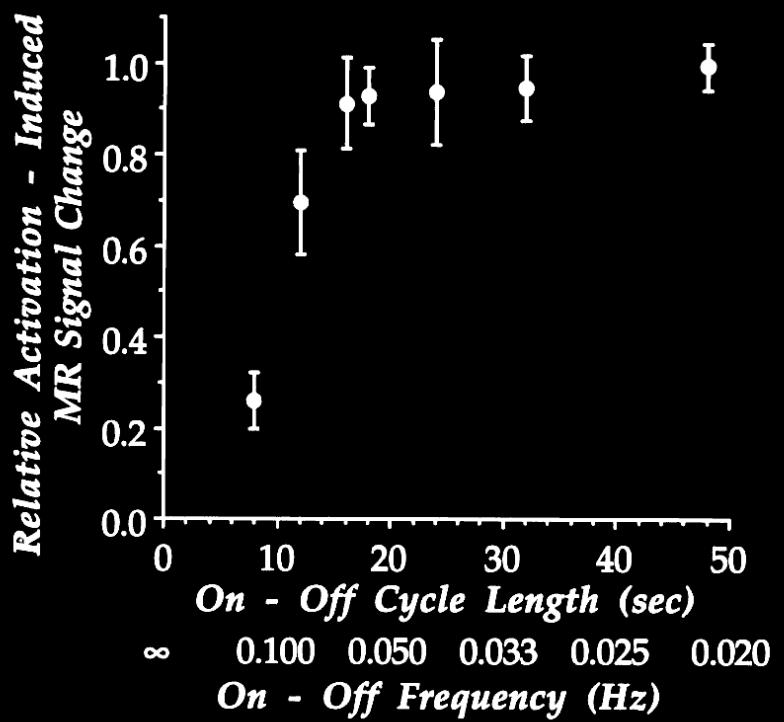
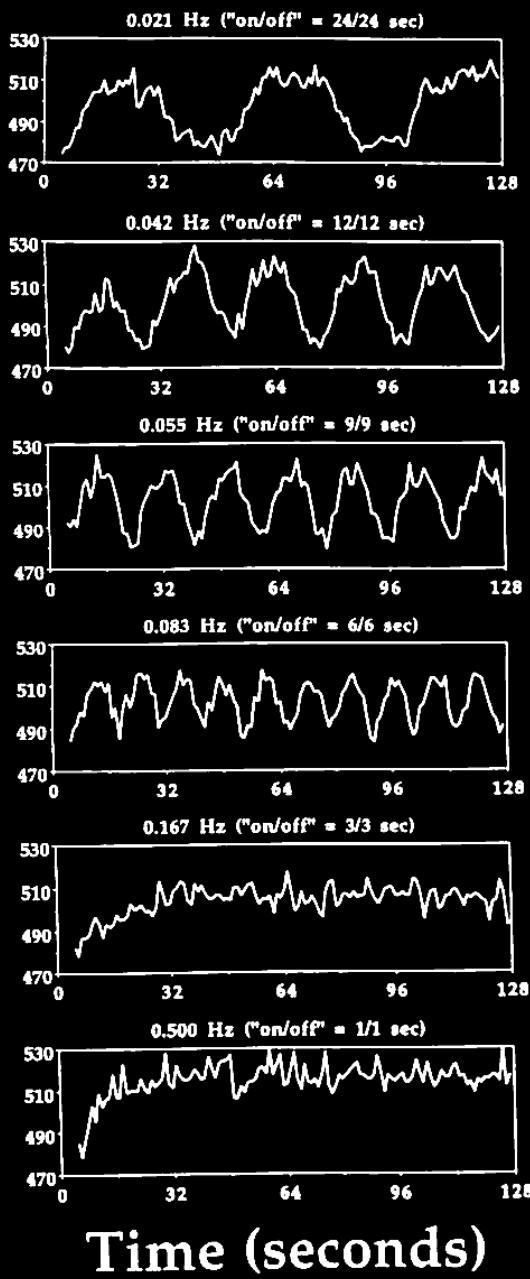


**Subject 2**

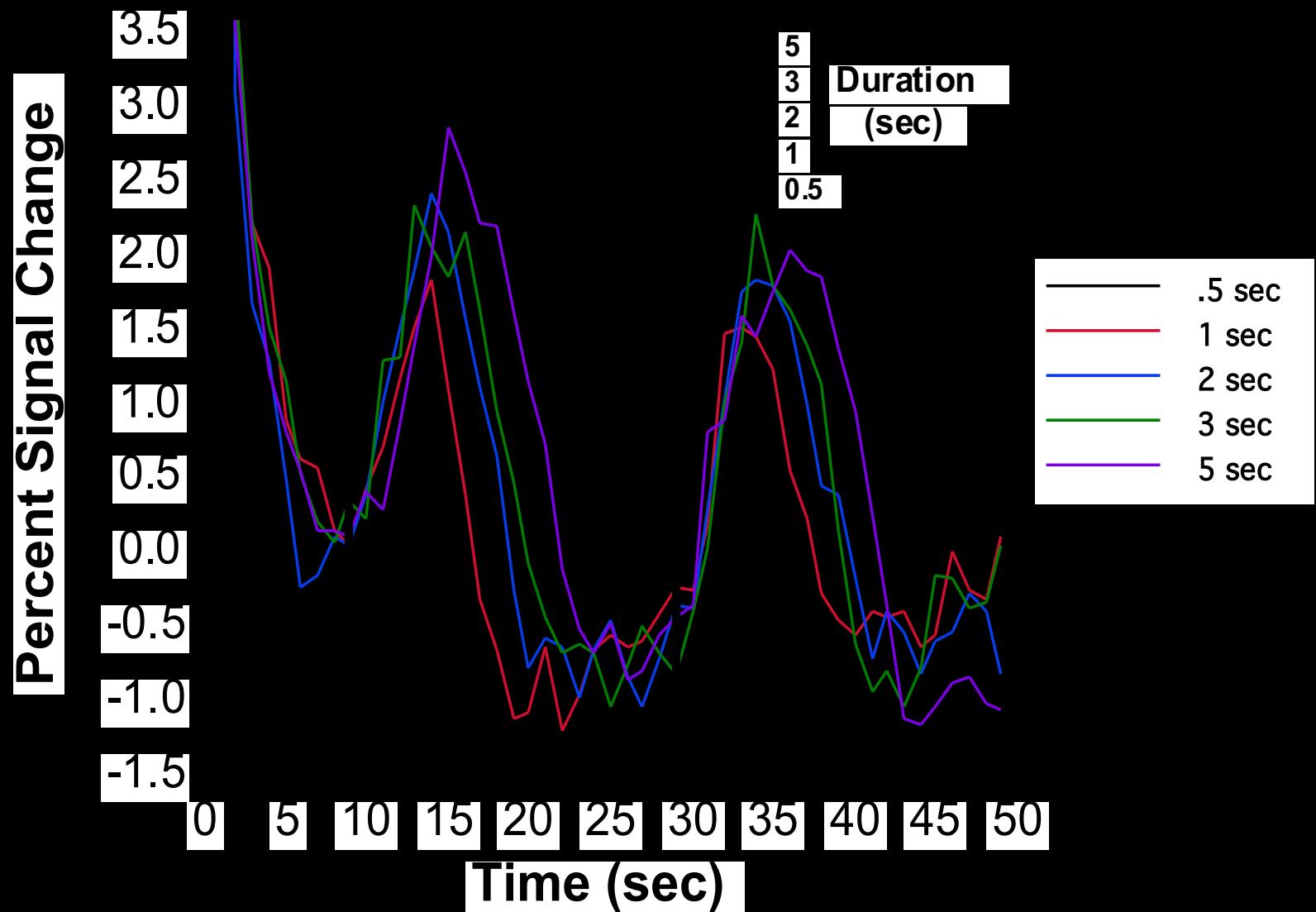


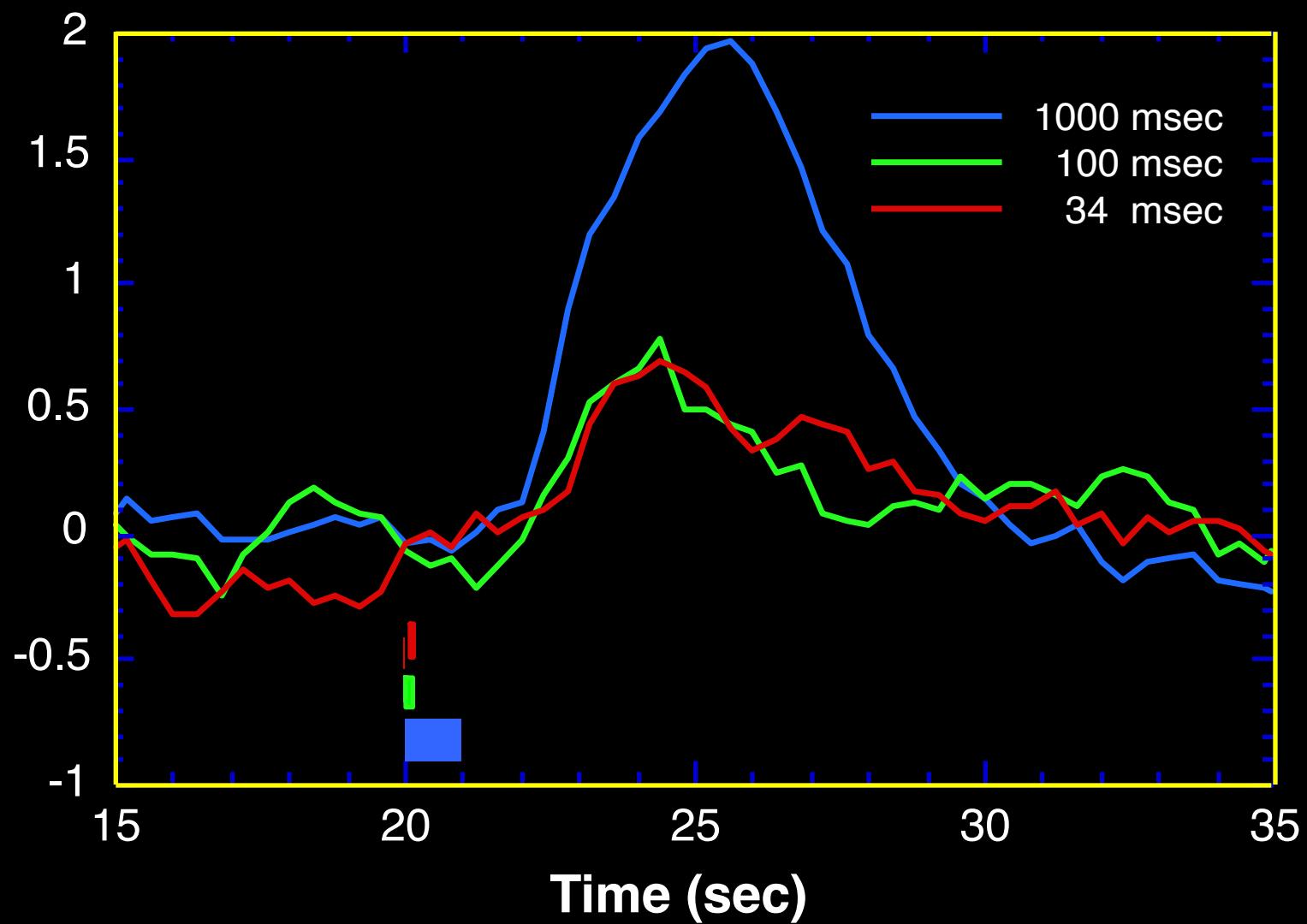
fMRI signal change dynamics...

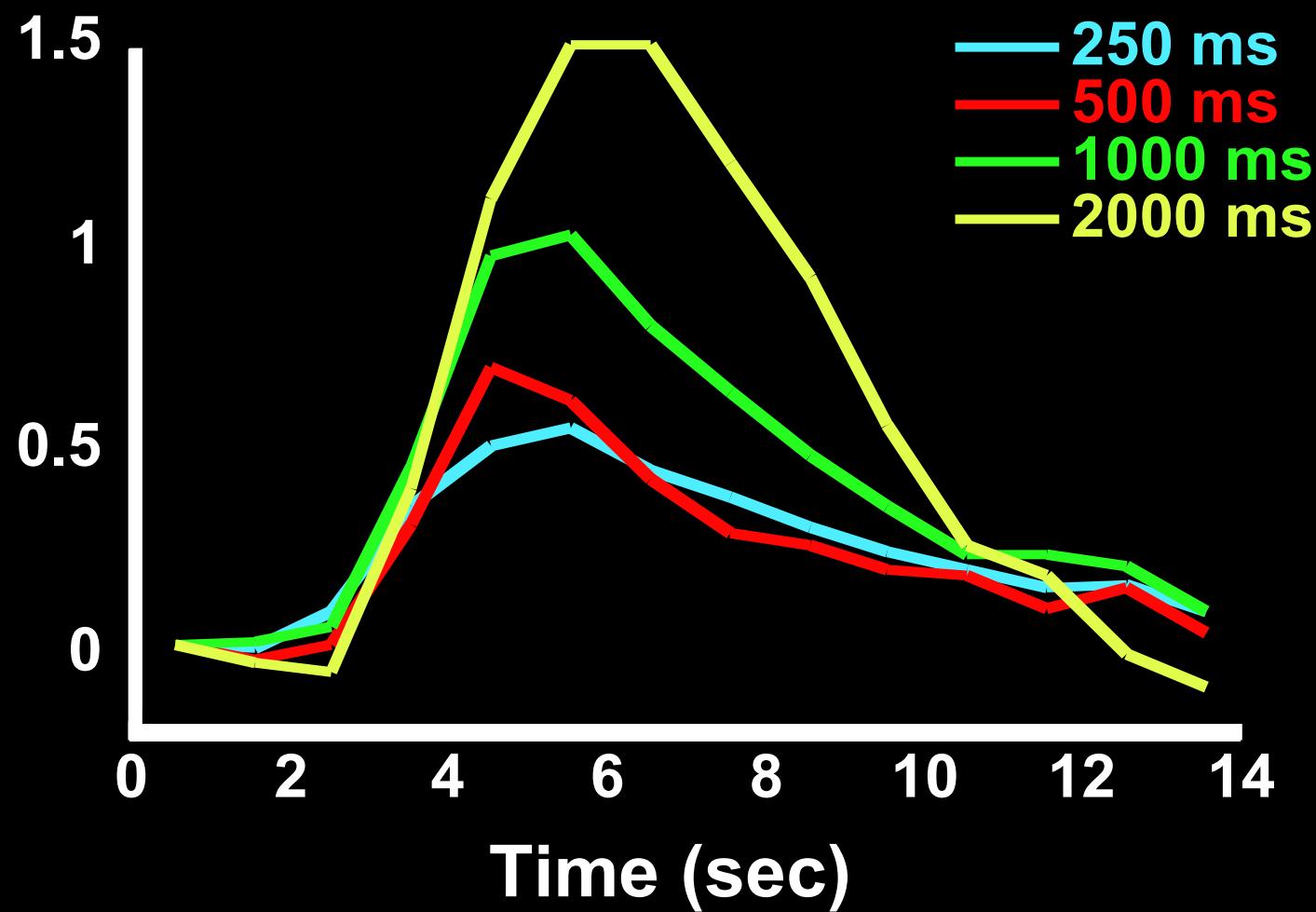
# MRI Signal



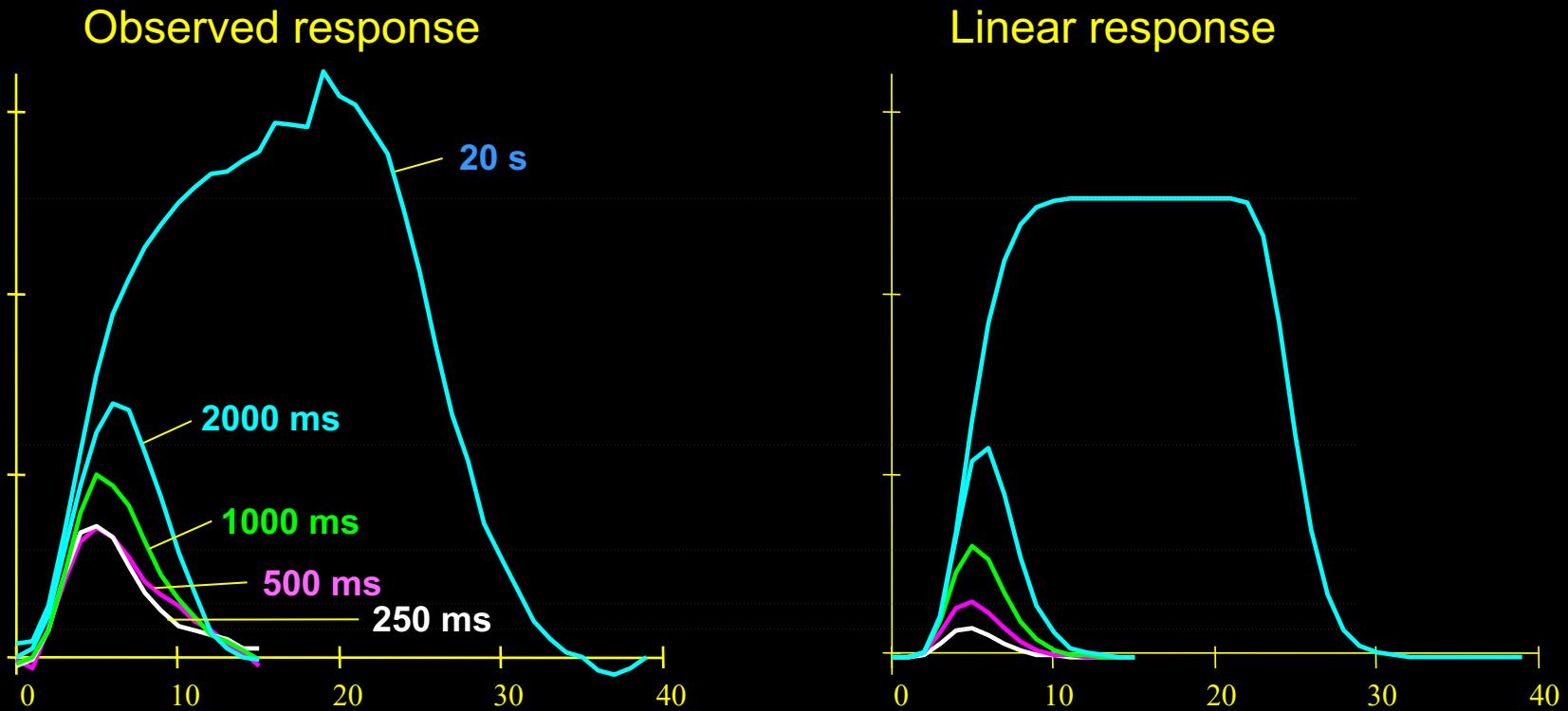
# Motor Cortex







# BOLD response is nonlinear



*Short duration stimuli produce larger responses than expected*

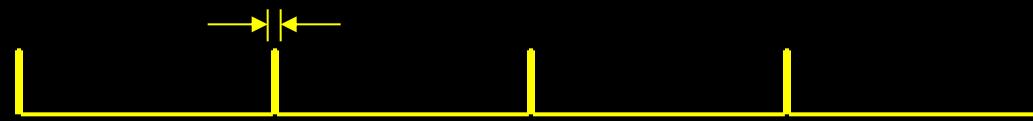
# Source of the Nonlinearity

- Neuronal
- Hemodynamic
  - *Miller et al. 1998* – Flow is linear, BOLD is nonlinear
  - *Friston et al. 2000* – hemodynamics can explain nonlinearity

*If nonlinearity is hemodynamic in origin, a measure of this nonlinearity will reflect any spatial variation of the vasculature*

# Methods

Stimulus Duration (SD)



*Visual*

*Motor*

SD = 250 ms

SD = 500 ms



SD = 500 ms

SD = 1000 ms



SD = 1000 ms

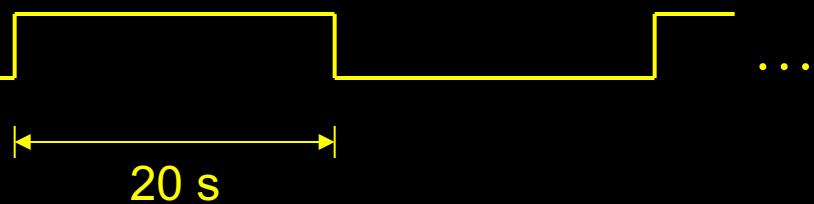
SD = 2000 ms



SD = 2000 ms

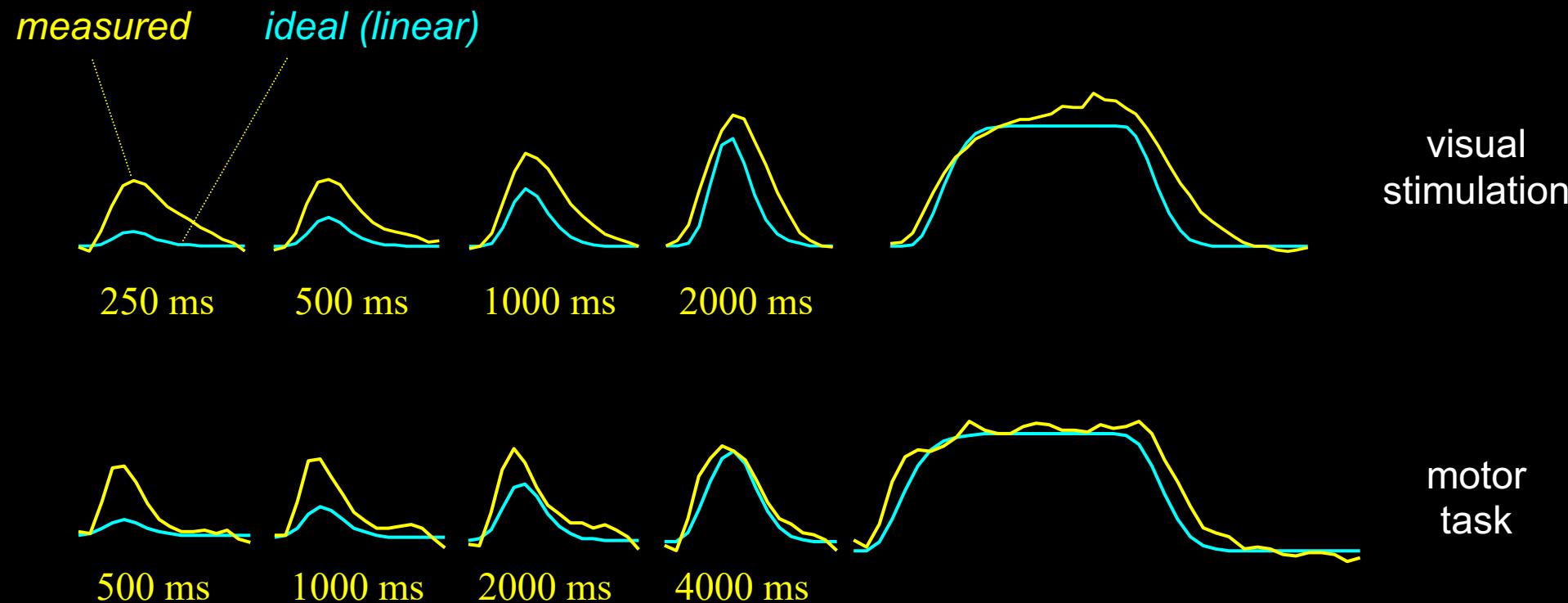
SD = 4000 ms

16 s



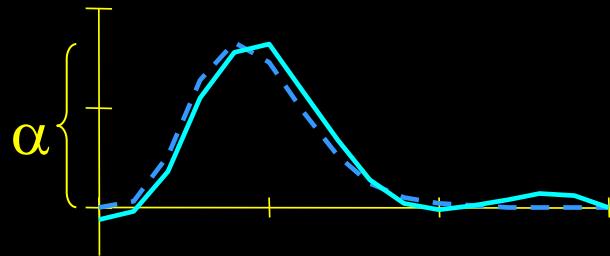
Blocked Trial

# Observed Responses



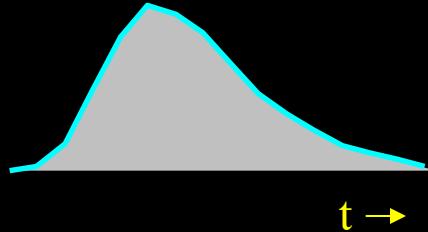
# Compute nonlinearity (*for each voxel*)

- Amplitude of Response



*Fit ideal (linear) to response*

- Area under response / Stimulus Duration

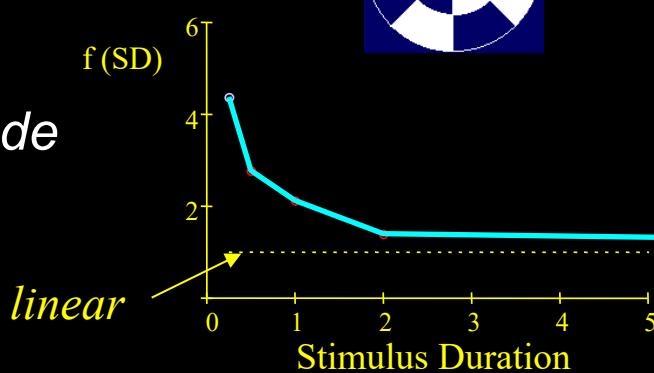


*Output Area / Input Area*

# Nonlinearity

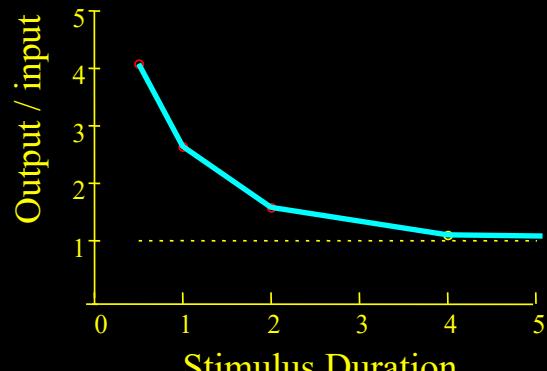
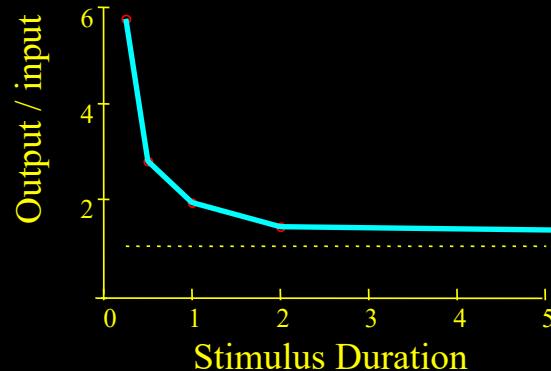
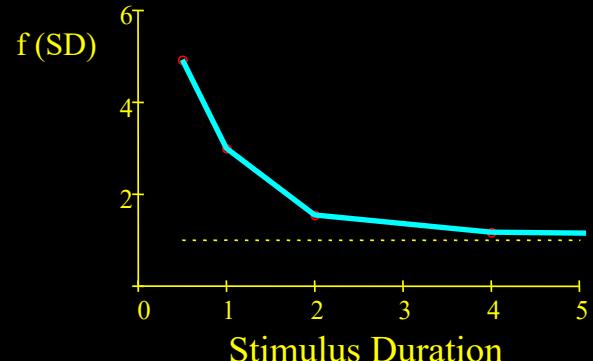
Visual

Magnitude



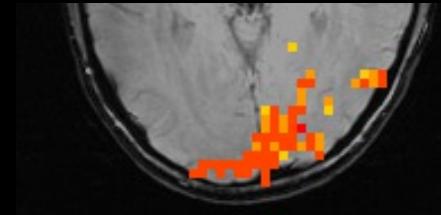
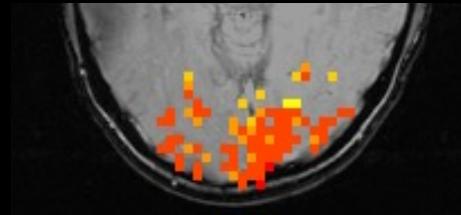
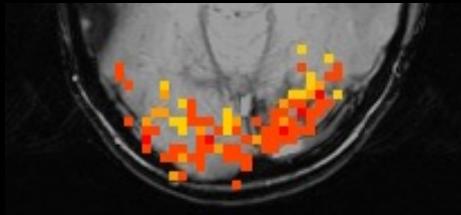
Motor

Area

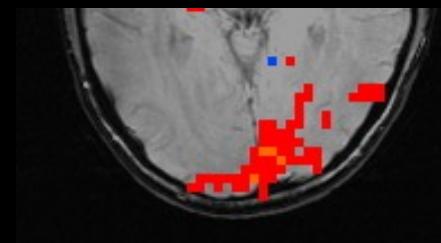
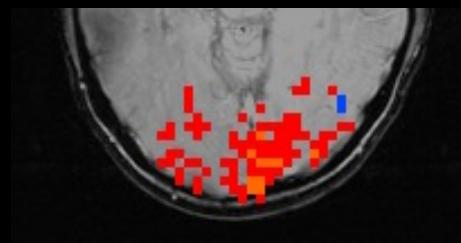
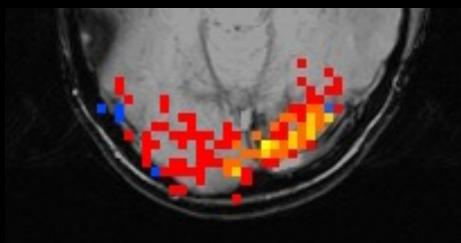


# Results – visual task

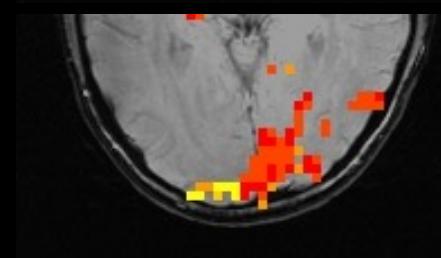
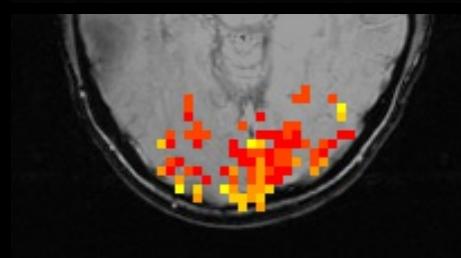
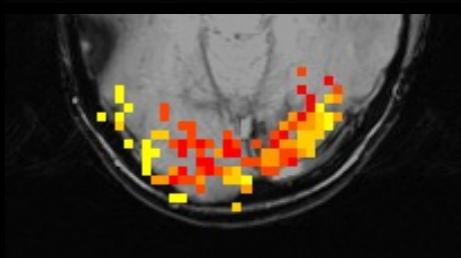
Nonlinearity



Magnitude

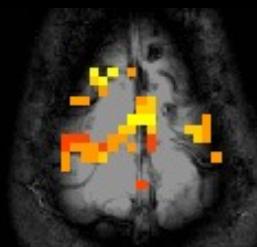
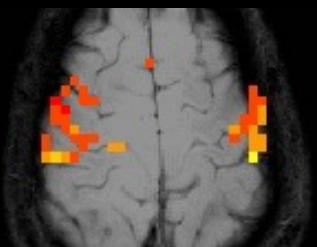
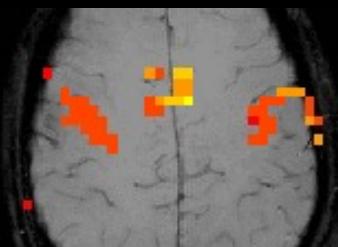


Latency

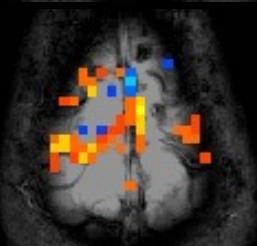
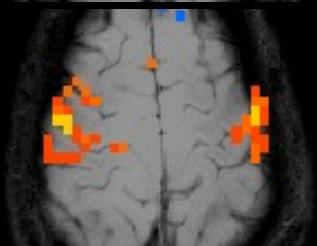
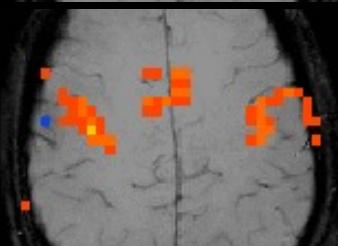


# Results – motor task

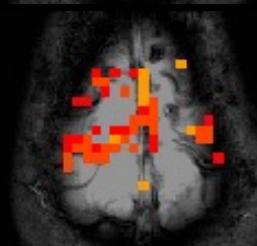
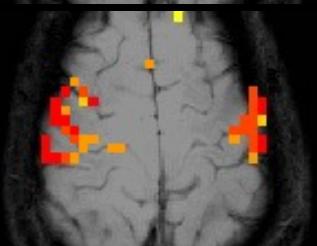
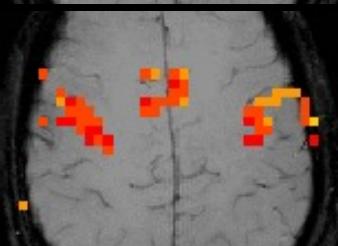
Nonlinearity



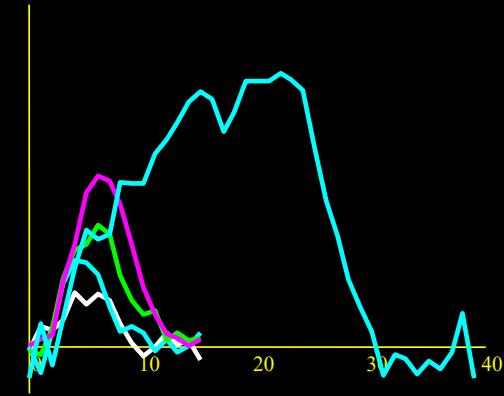
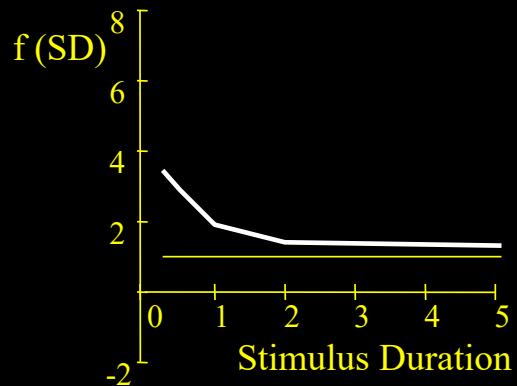
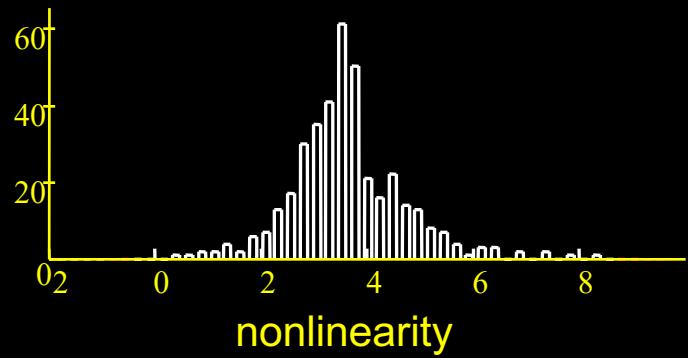
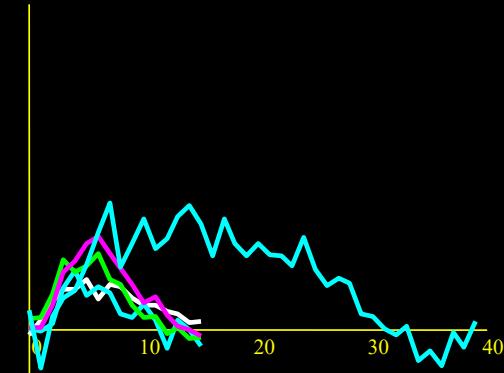
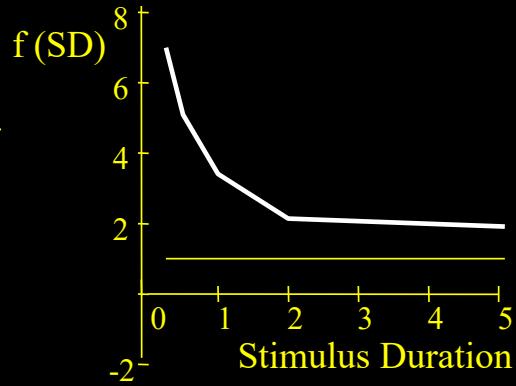
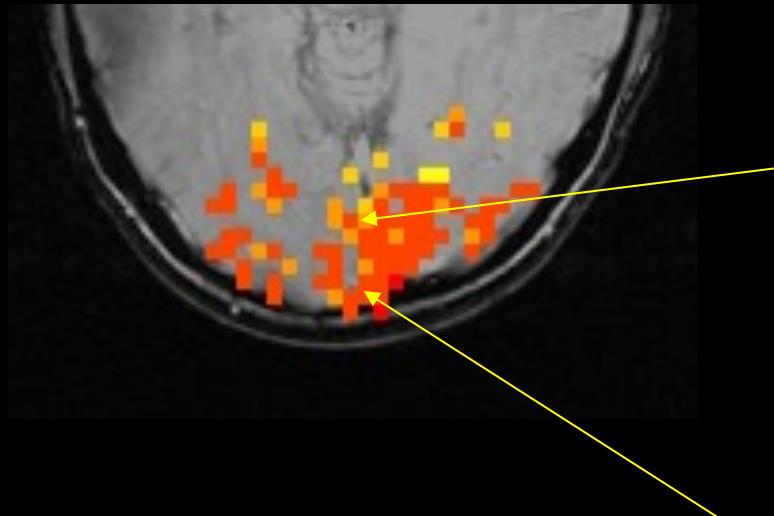
Magnitude



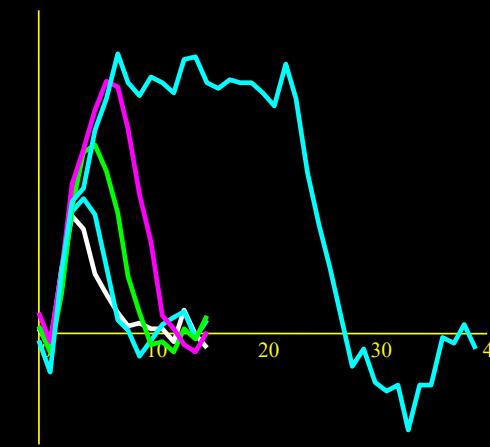
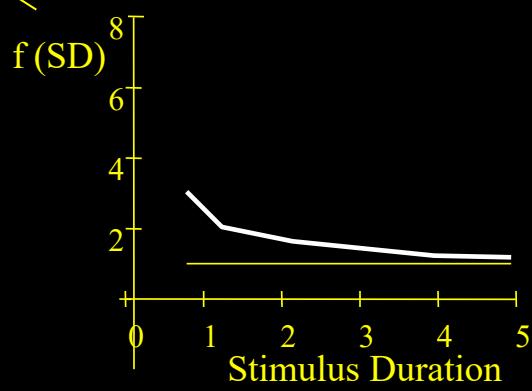
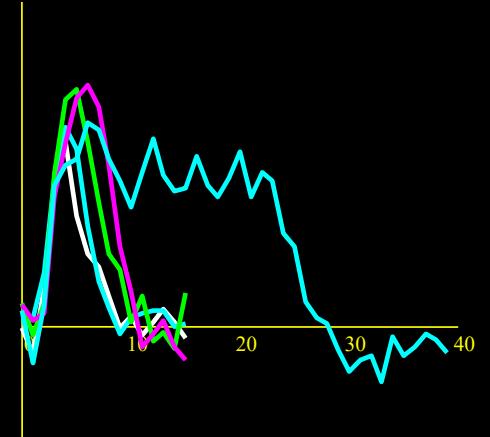
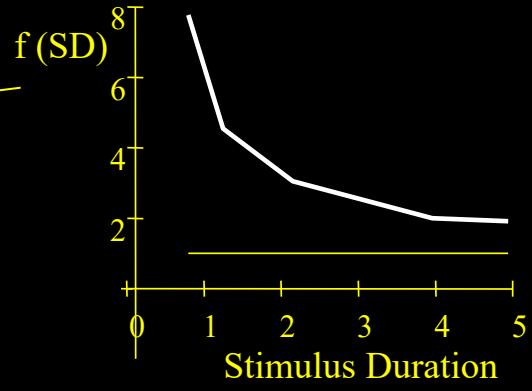
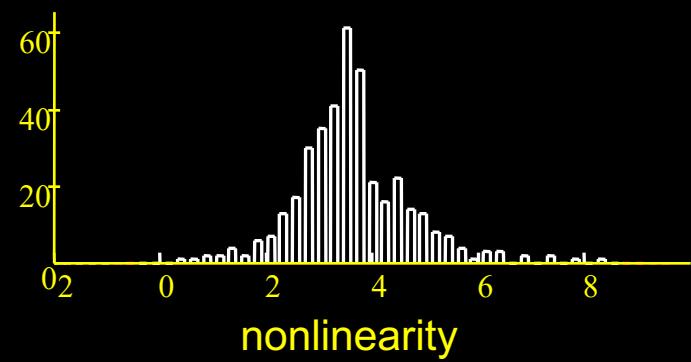
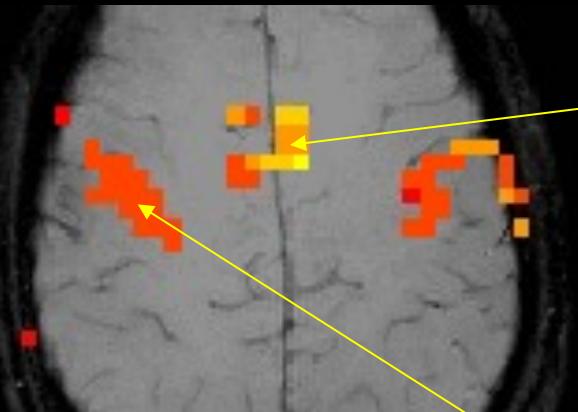
Latency



# Results – visual task

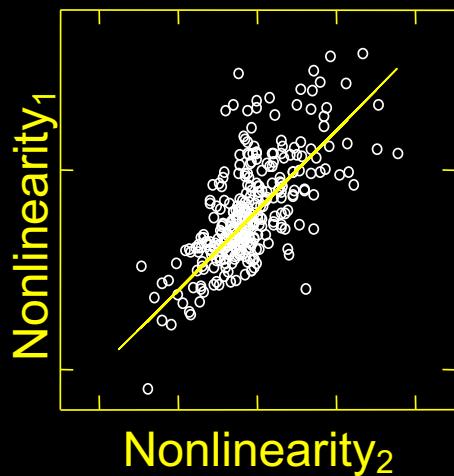


# Results – motor task

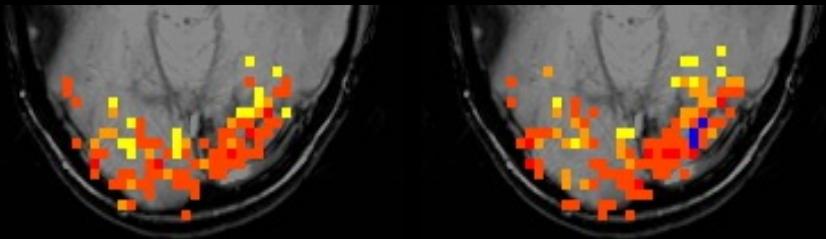
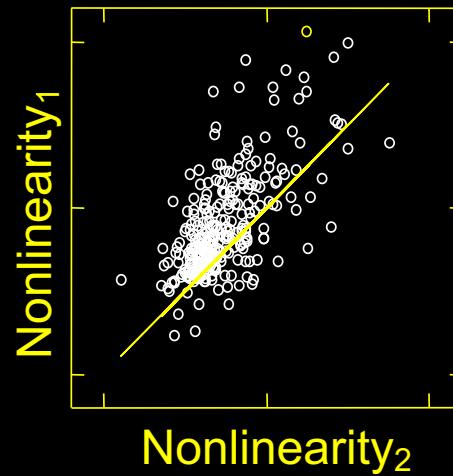


# Reproducibility

*Visual task*

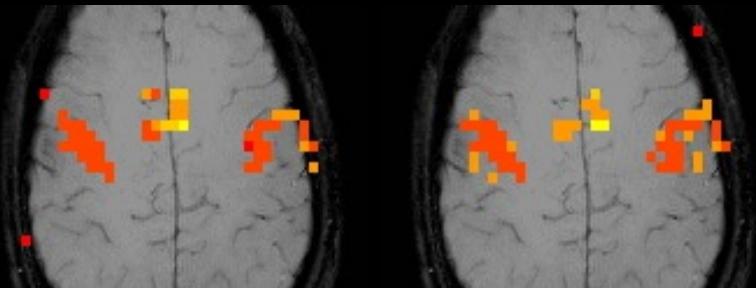


*Motor task*



Experiment 1

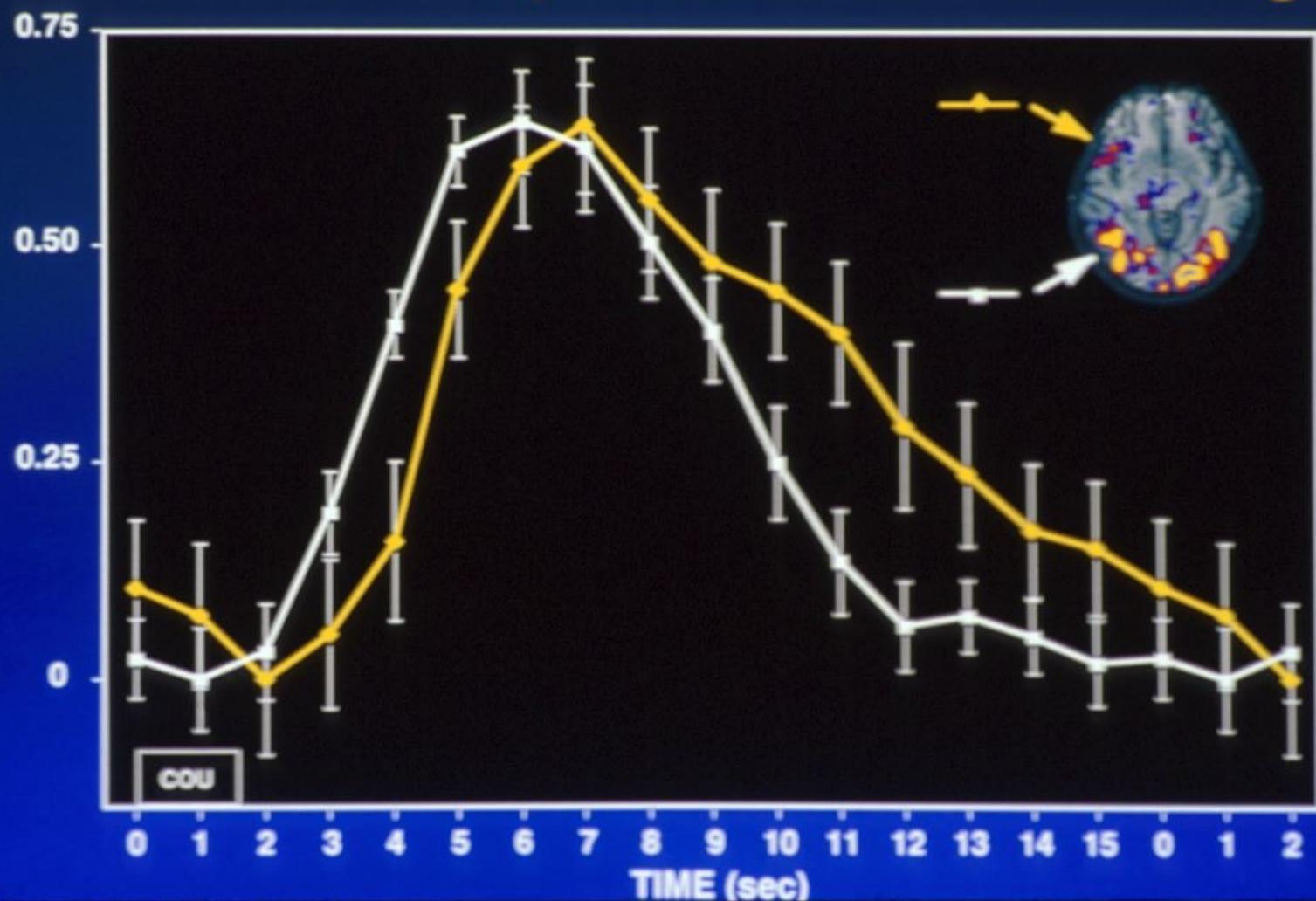
Experiment 2



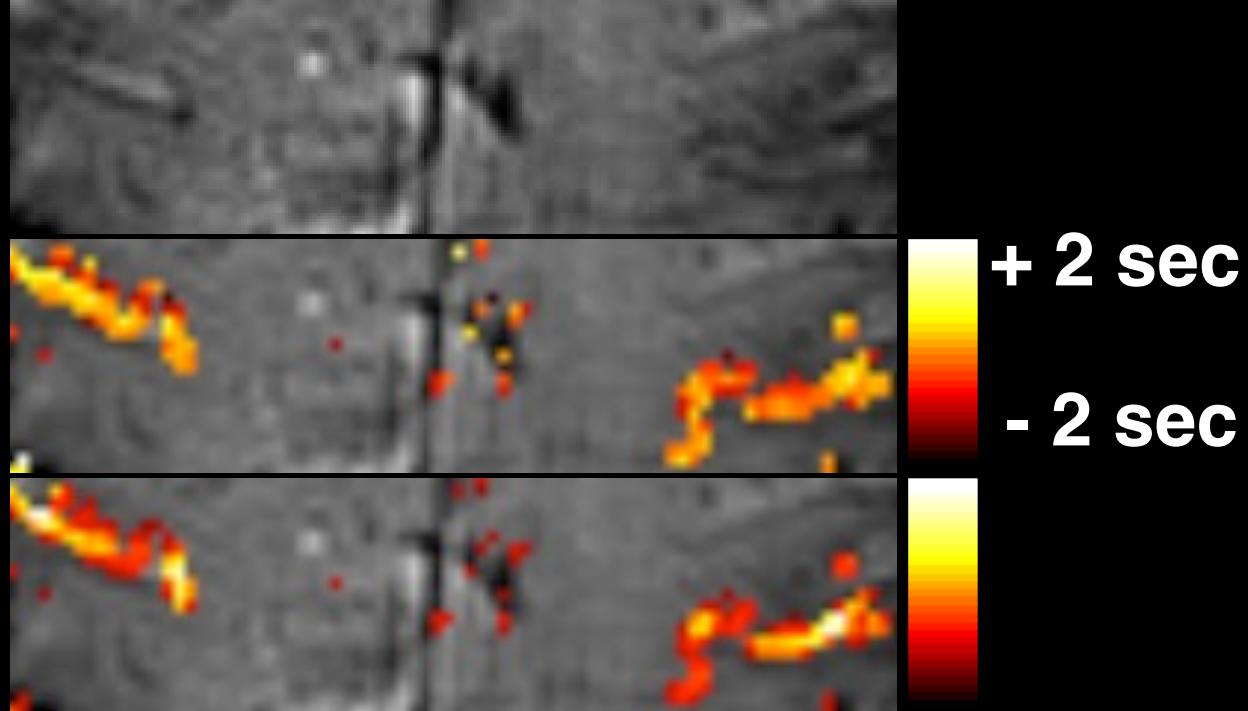
Experiment 1

Experiment 2

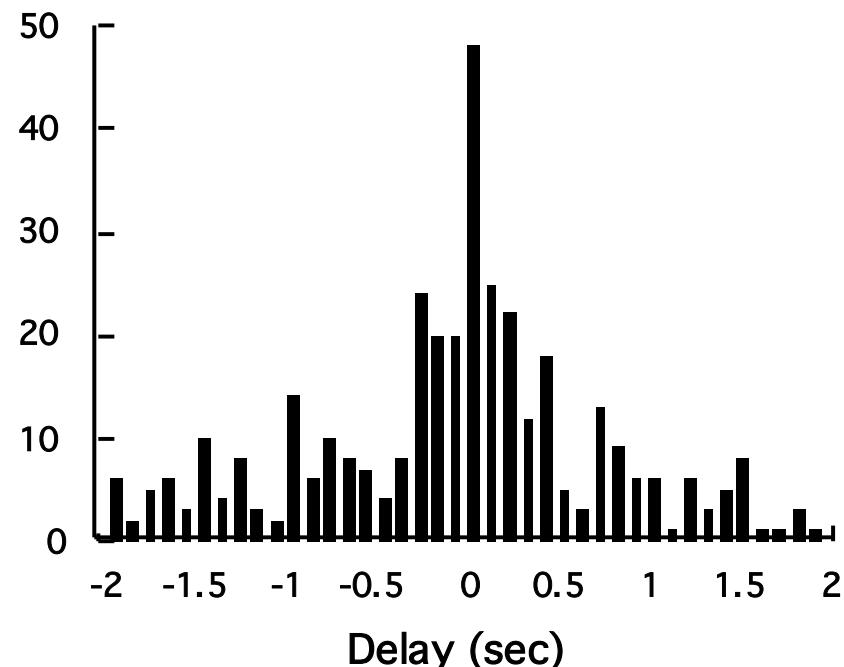
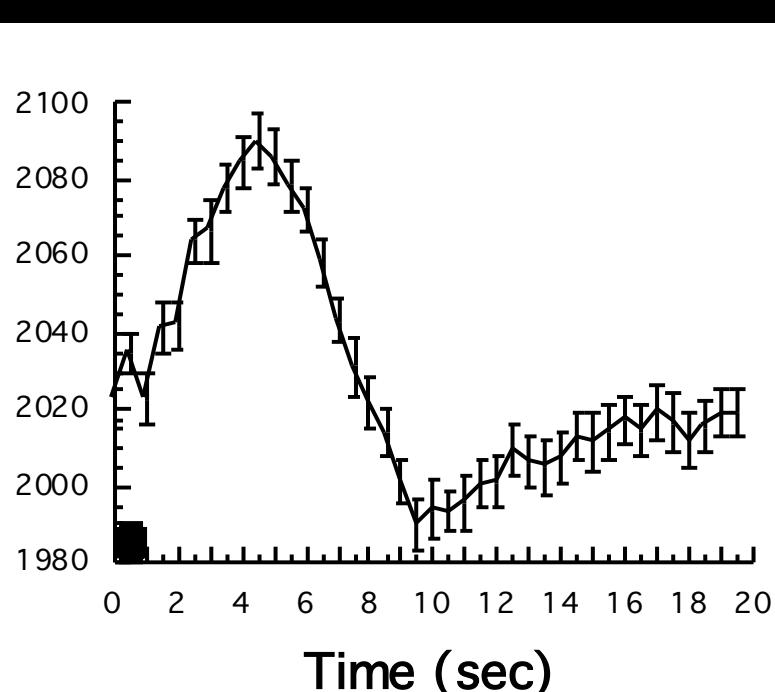
## Time Course Comparison Across Brain Regions



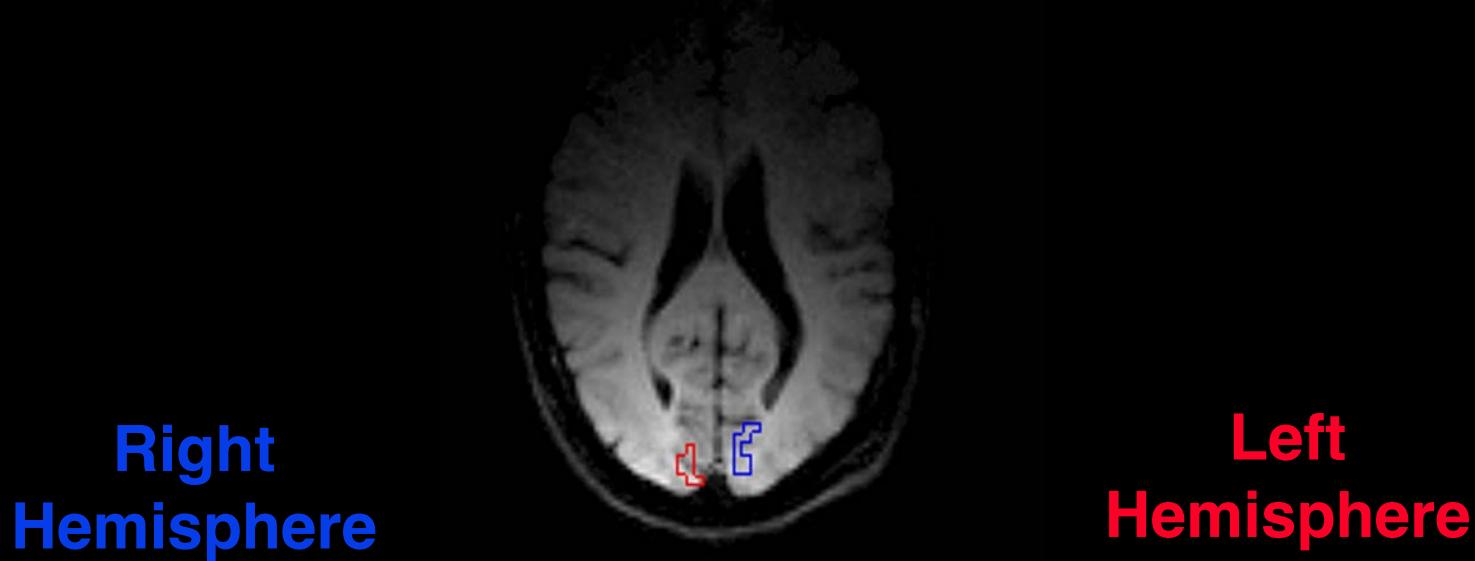
# Latency

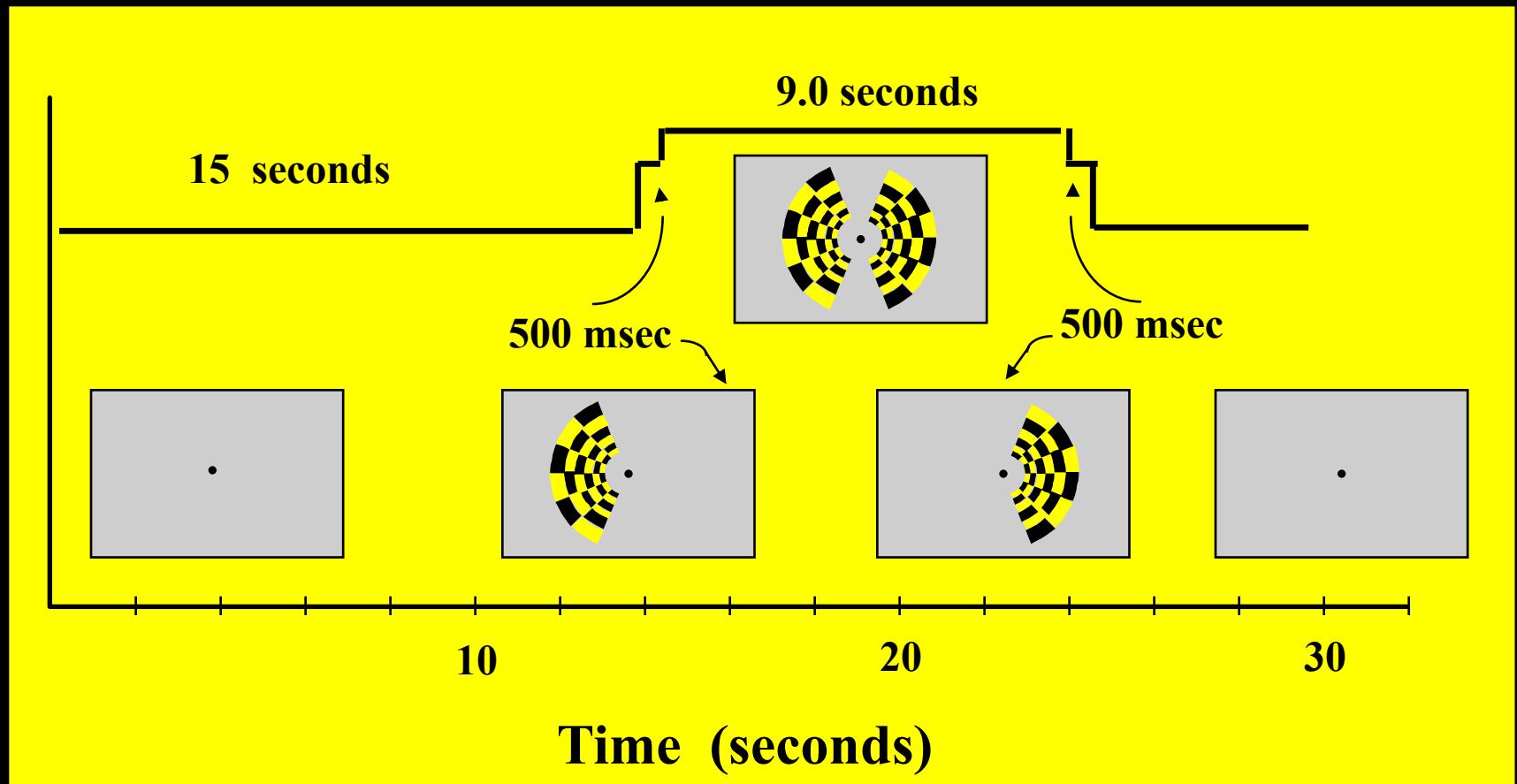


# Magnitude



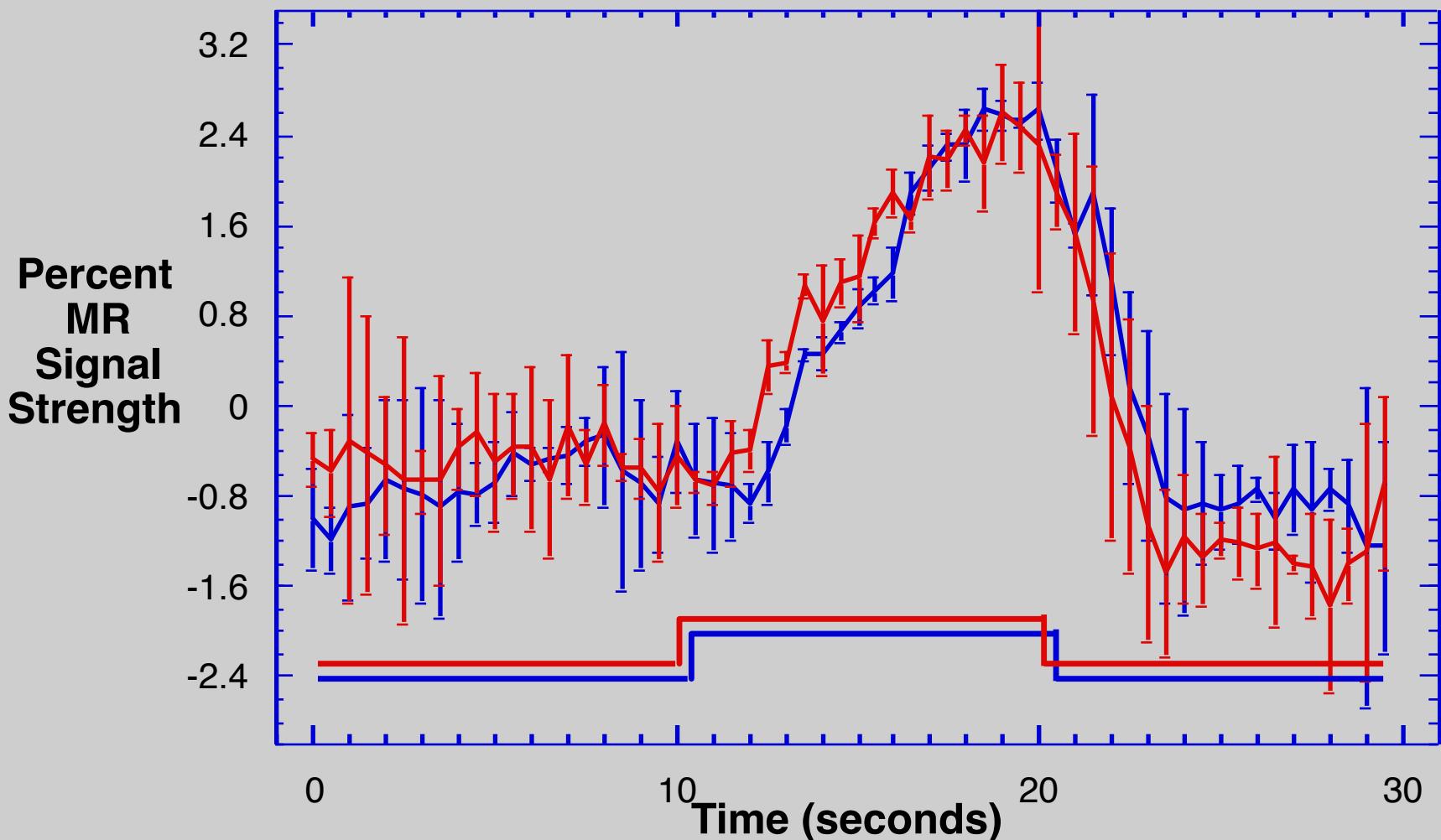
# Regions of Interest Used for Hemi-Field Experiment

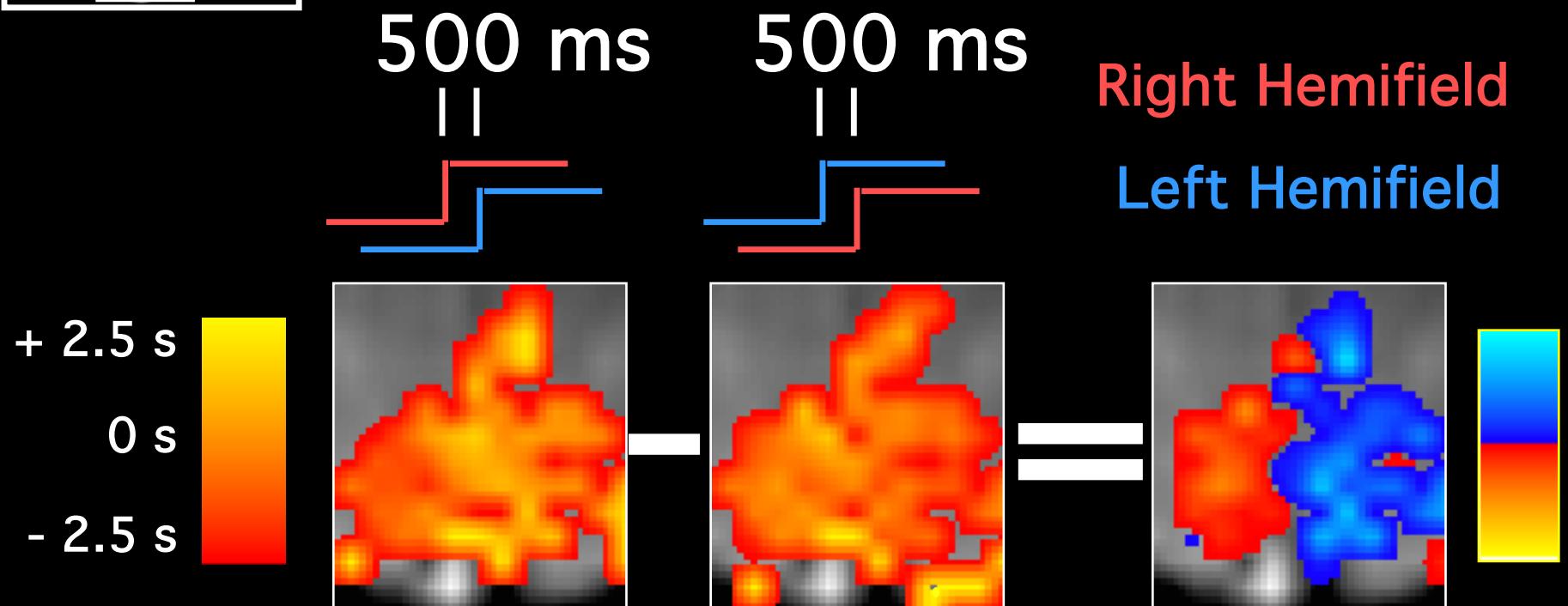
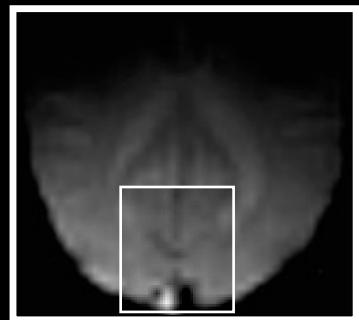


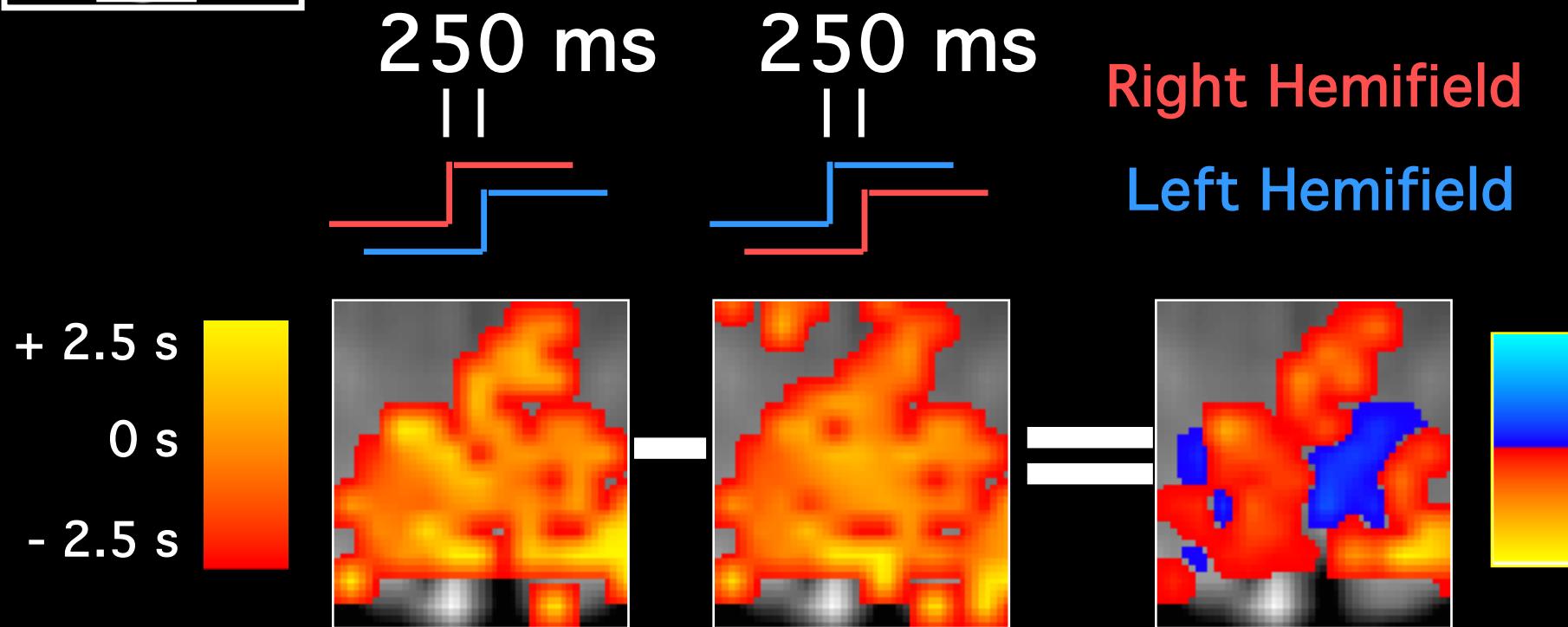
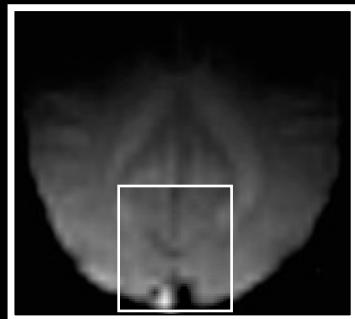


# Hemi-field with 500 msec asynchrony

Average of 6 runs    Standard Deviations Shown



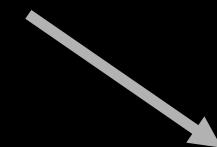




# What is “in” the data?

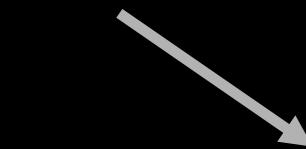
## Neuronal Activation

1. Task Related & Time Locked
2. Task Related & Not Time Locked
3. Not Task Related



## Hemodynamics

Cardiac Pulsation  
Respiration  
Motion



## MRI Signal Changes

# Motion

Recognize?

- Edge effects
- Shorter signal change latencies
- Unusually high signal changes
- External measuring devices

Correct?

- Image registration algorithms
- Orthogonalize to motion-related function (*cardiac, respiration, movement*)
- Navigator echo for k-space alignment  
*(for multishot techniques)*
- Re-do scan

Bypass?

- Paradigm timing strategies..
- Gating (with T1-correction)

Suppress?

- Flatten image contrast
- Physical restraint
- Averaging, smoothing

# 0.25 Hz Breathing at 1.5T

Power Spectra

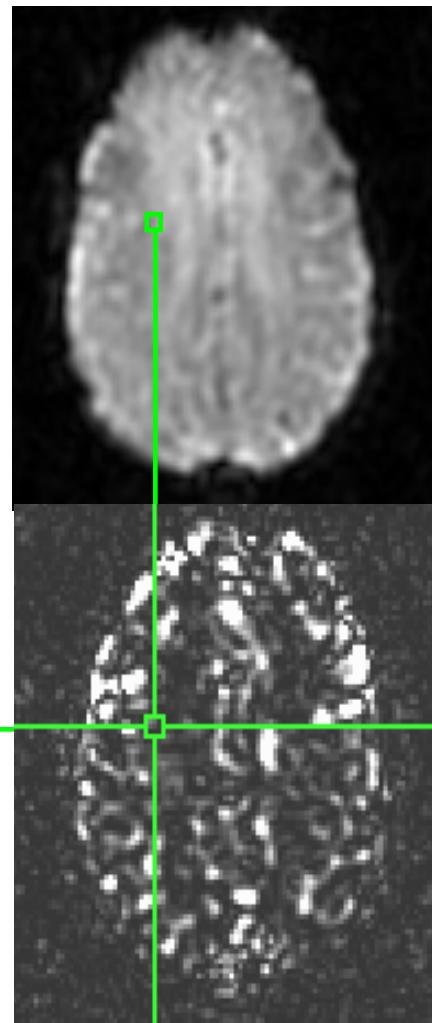
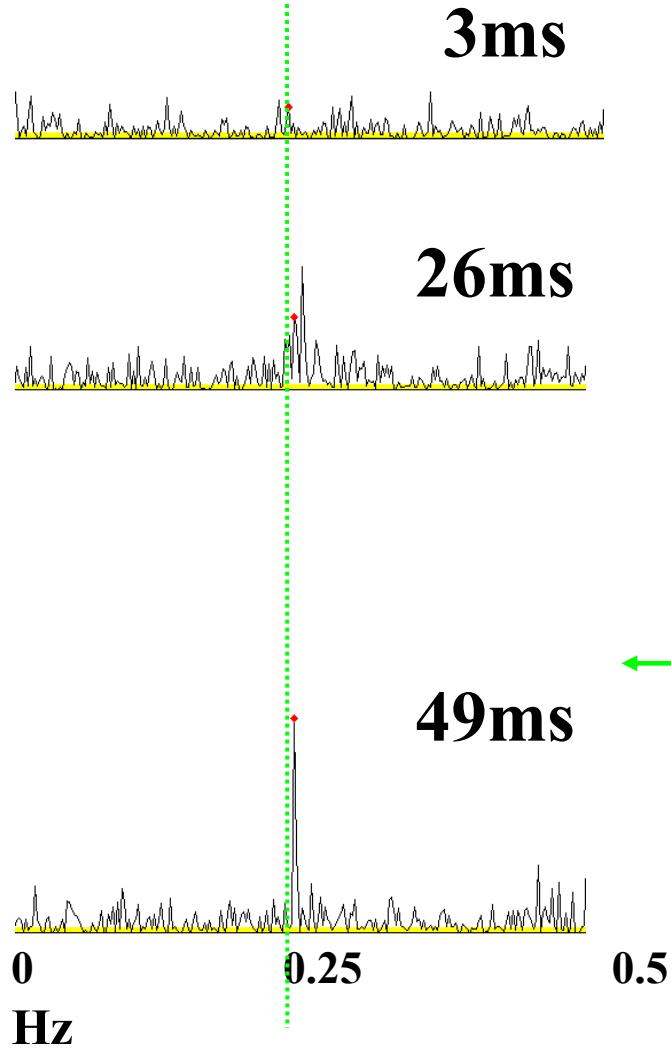


Image Respiration map

# 0.68 Hz Cardiac rate at 3T

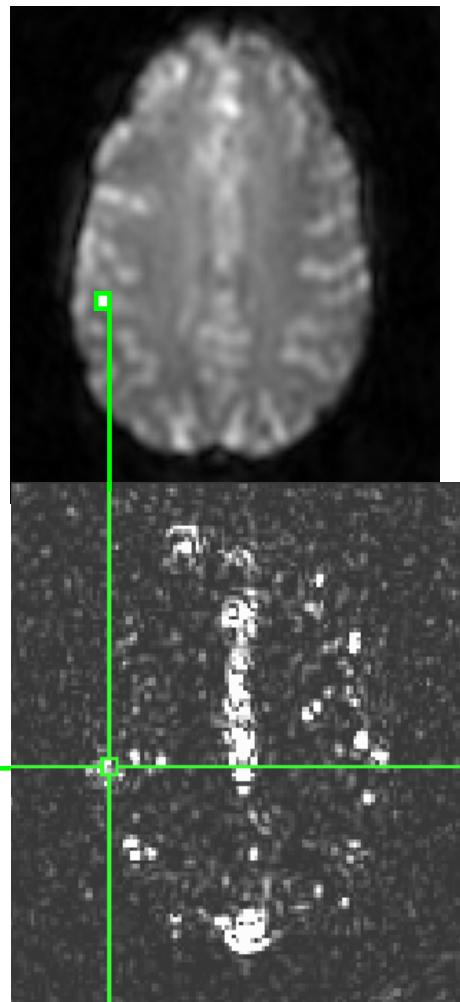
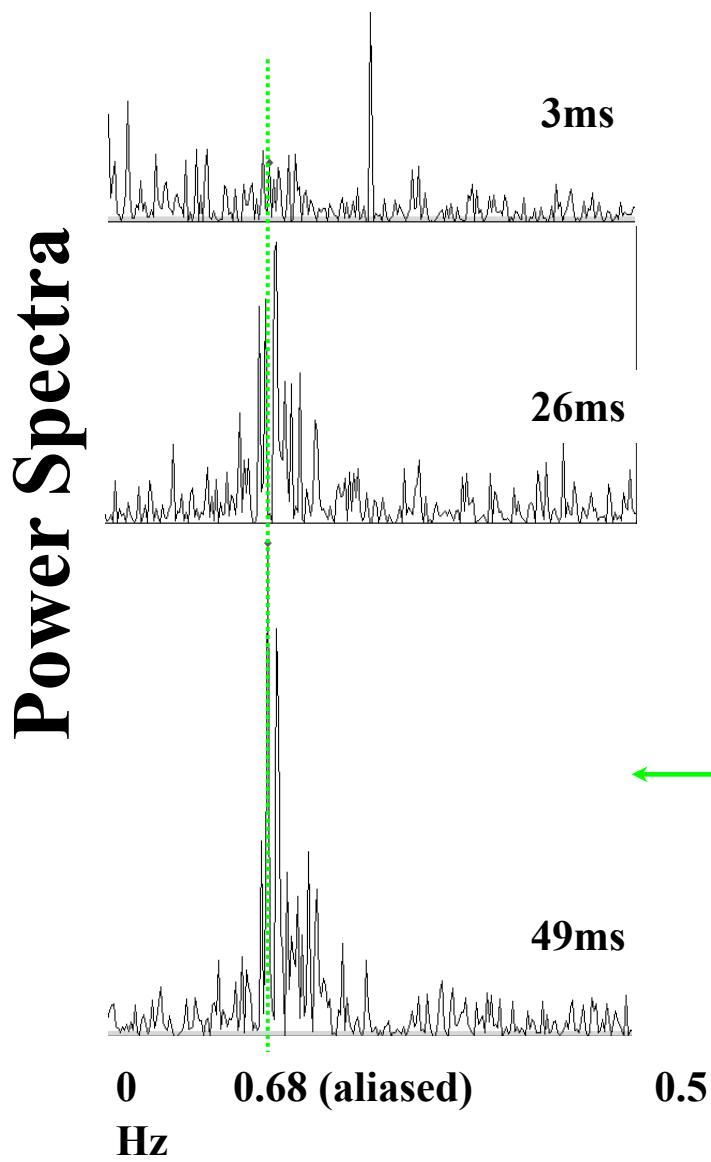
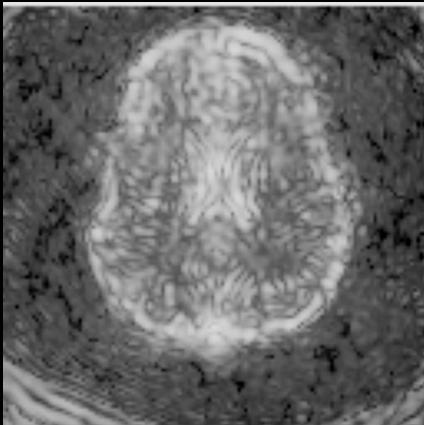


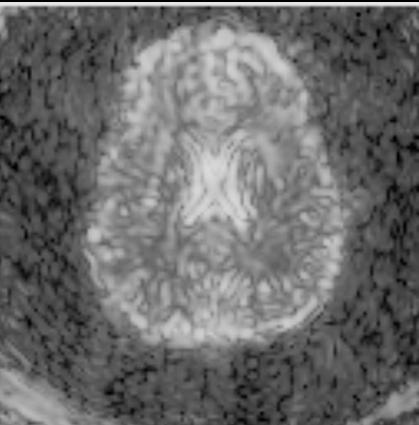
Image  
Cardiac map

# Temporal vs. Spatial SNR- 3T

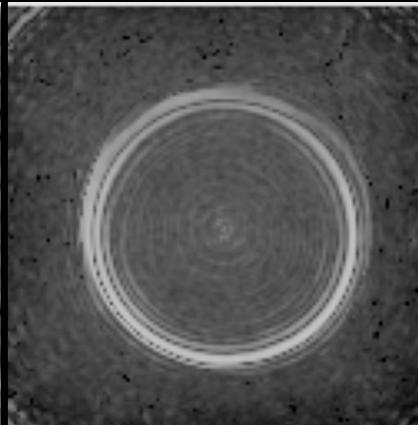
26ms



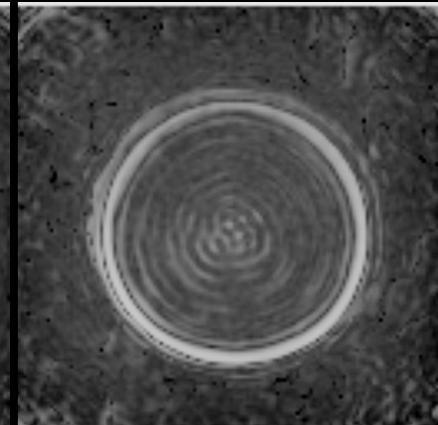
49ms



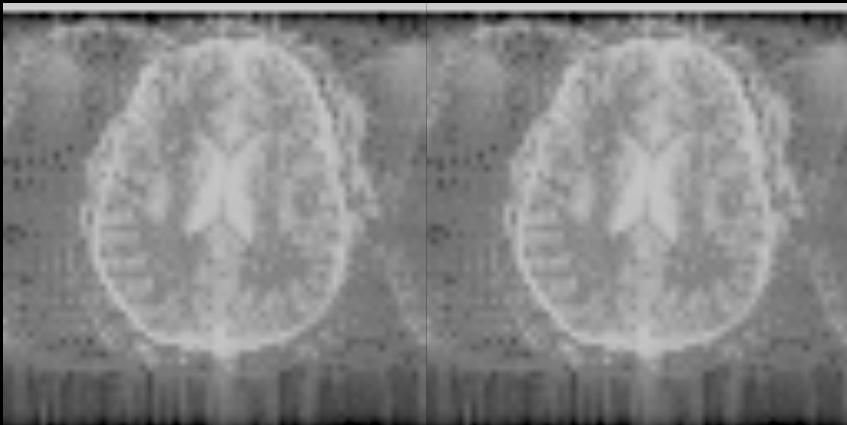
26ms



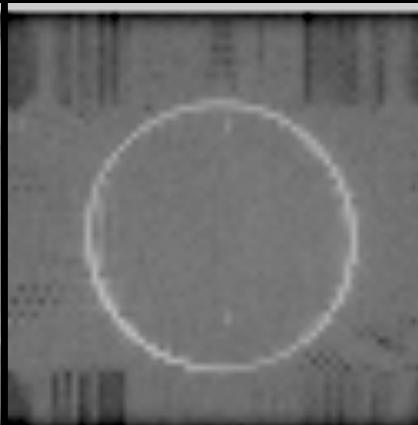
49ms



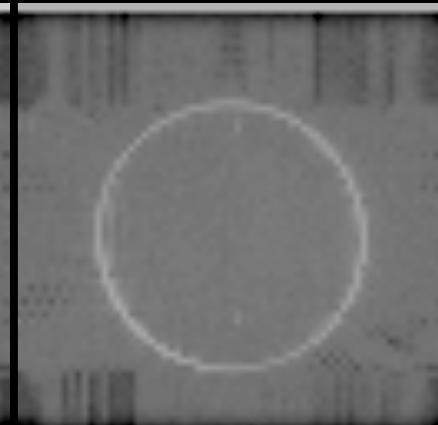
27ms



50ms



27ms

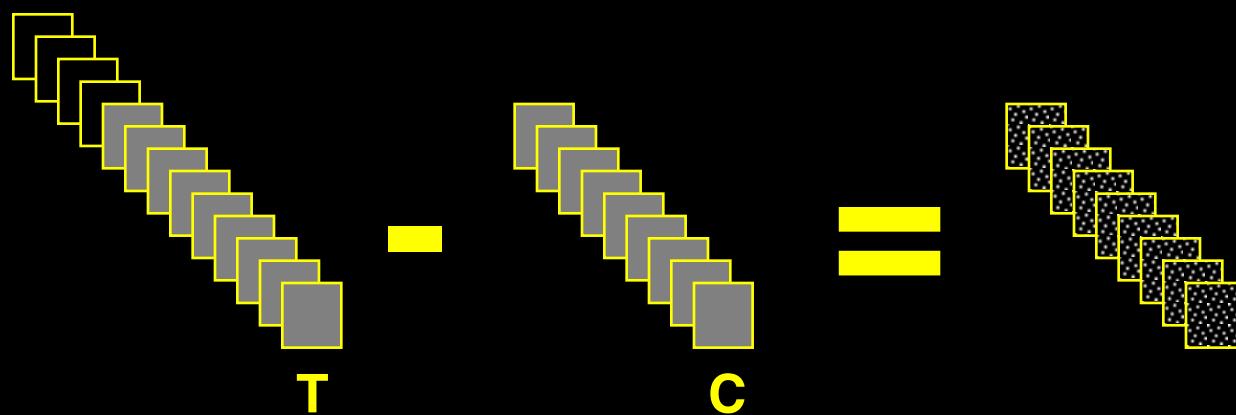
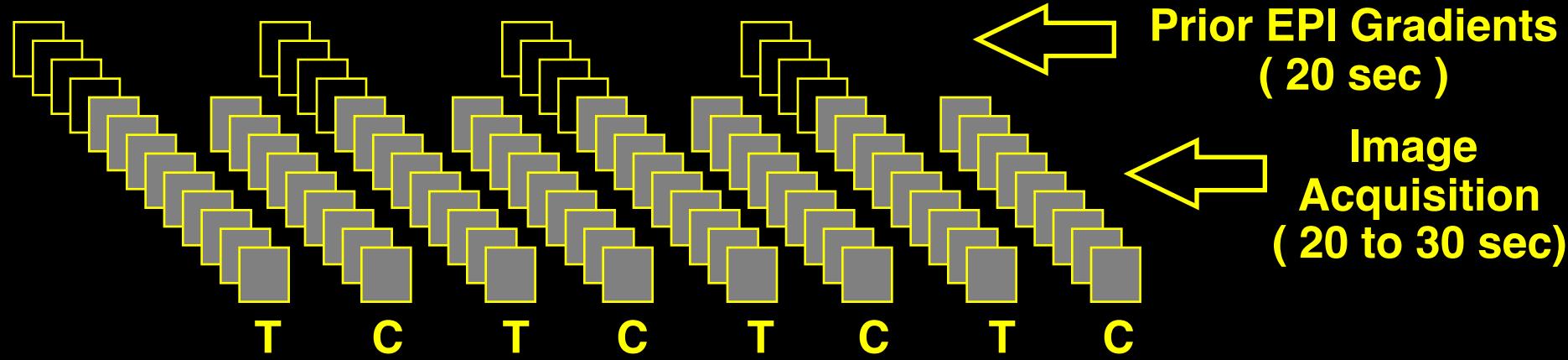


50ms

SPIRAL EPI

Another artifact...

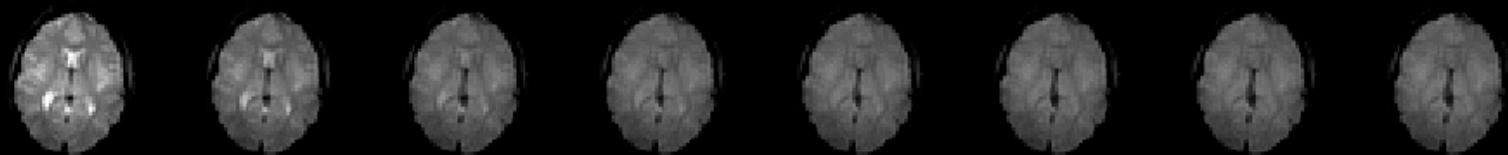
Auditory Activation by the Scanner...



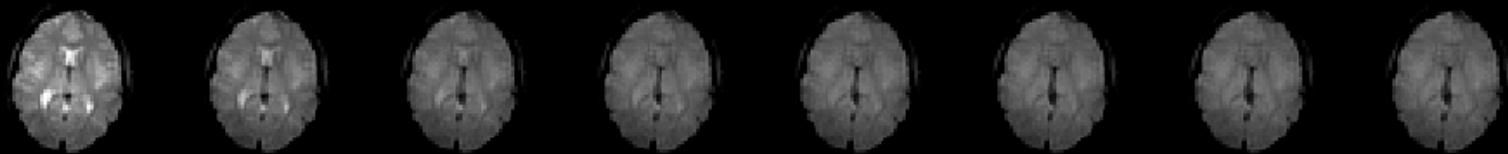
Average Time Series

Difference Time Series

**a.**



**b.**



**c.**



**0**

**1**

**2**

**3**

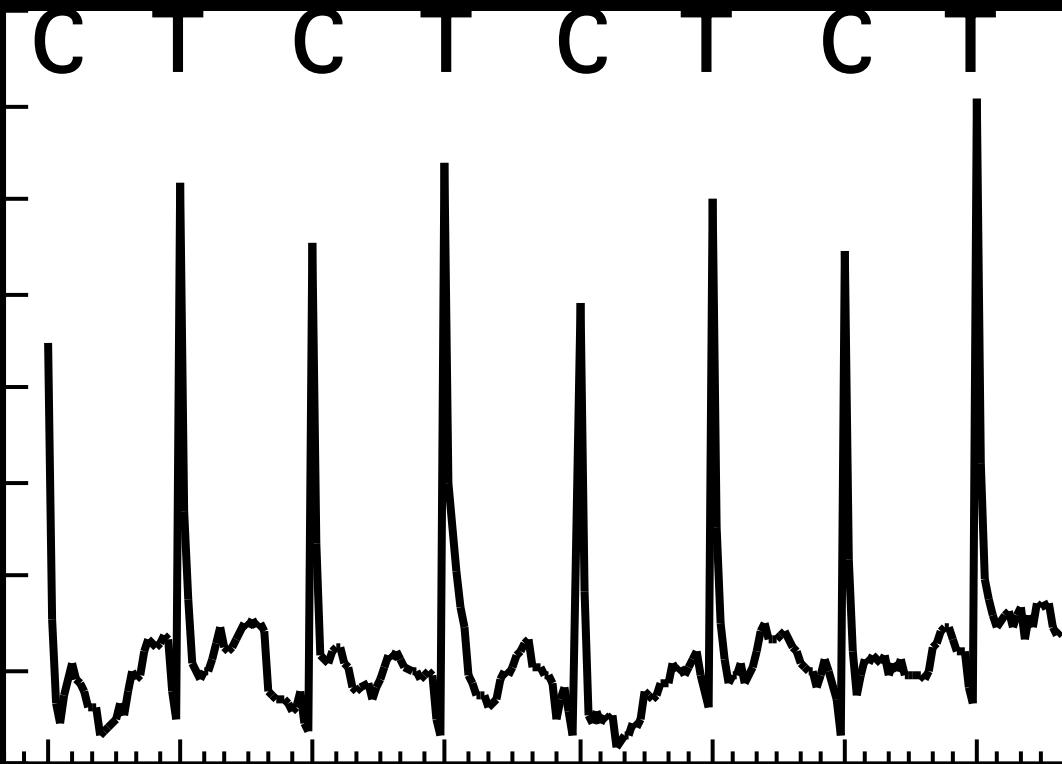
**4**

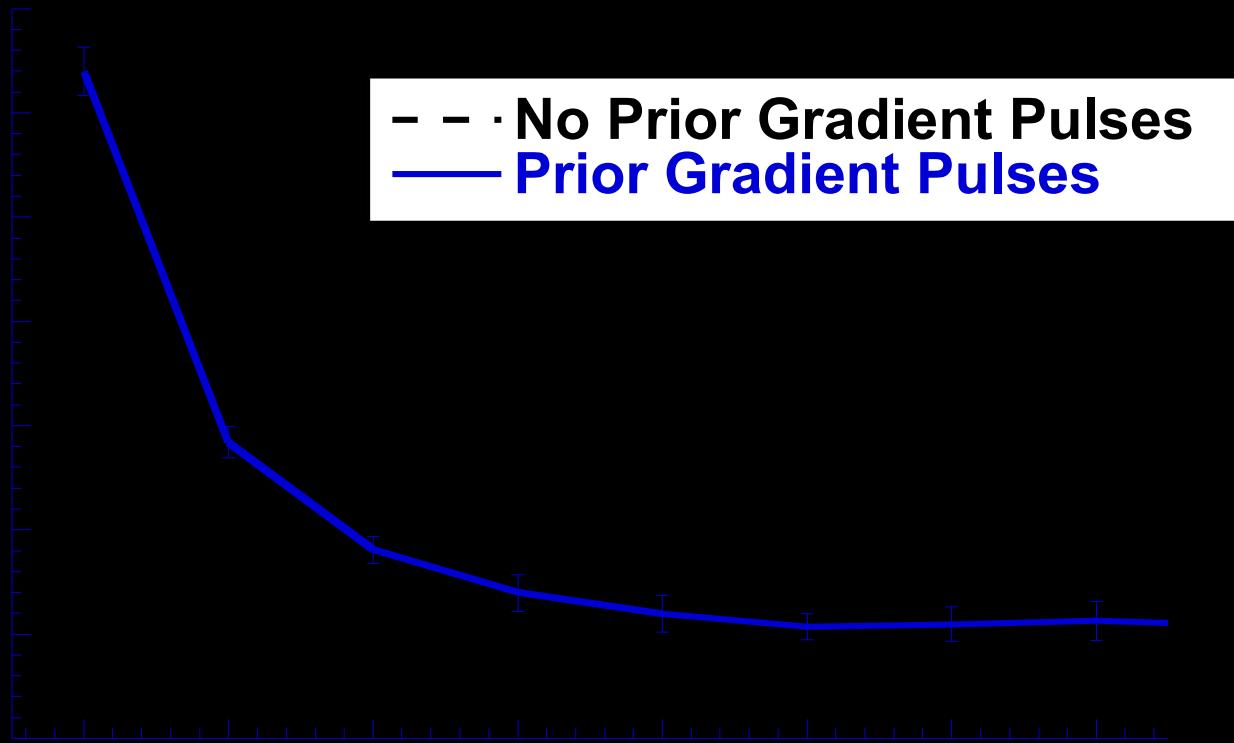
**5**

**6**

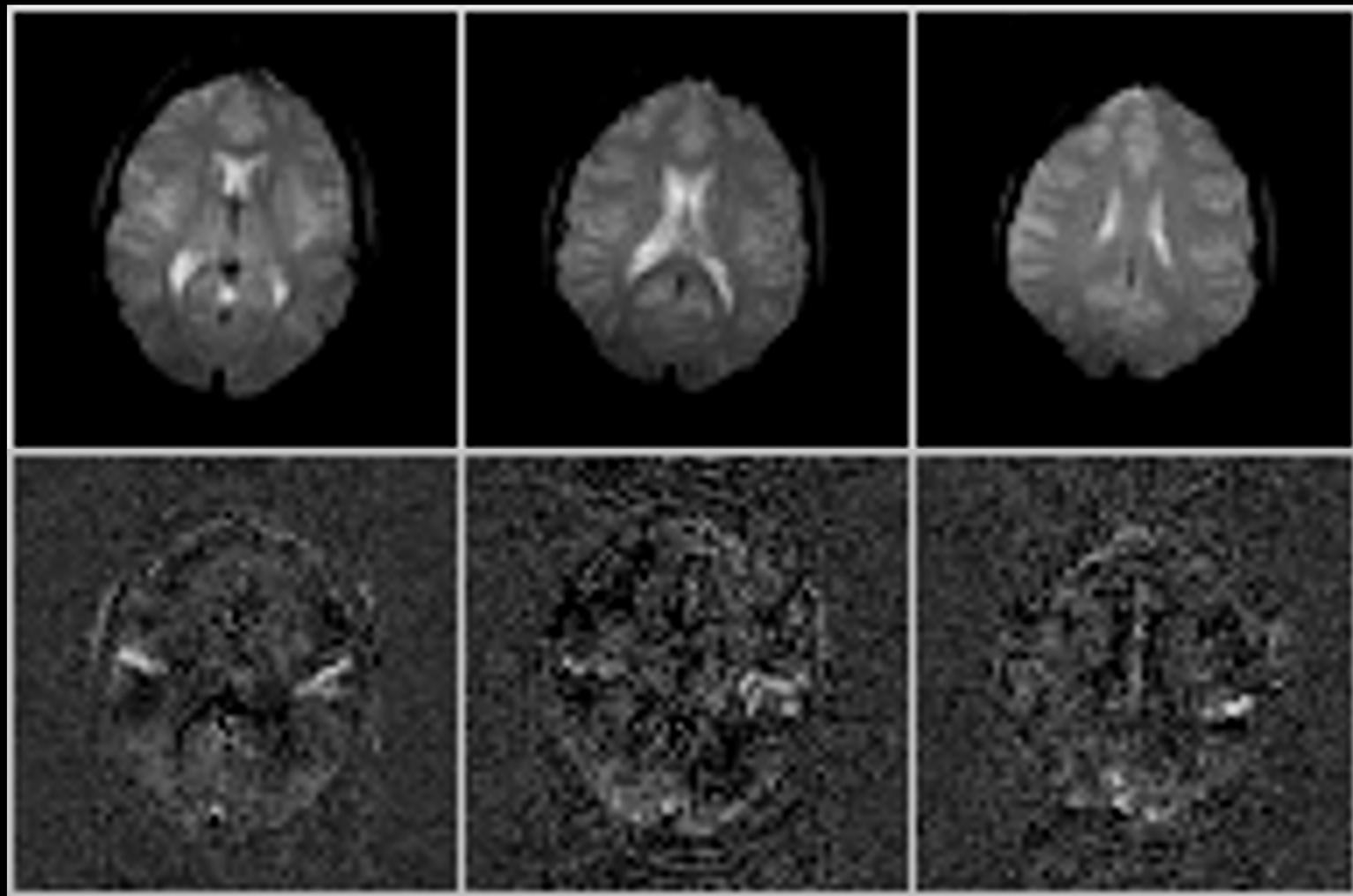
**7**

**Time (sec)**









# How to deal with Scanner Noise?

- Clustered volume acquisition  
Talavage et al.
- Silent sequences

# Neuronal Activation Input Strategies

1. Block Design

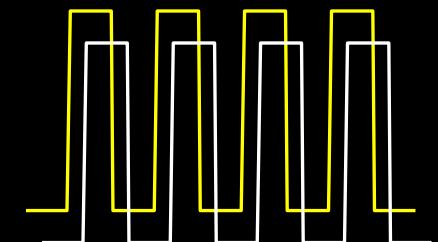
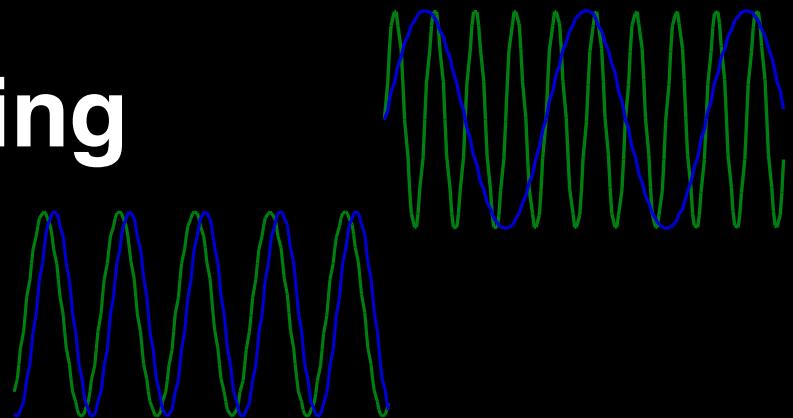
2. Frequency Encoding

3. Phase Encoding

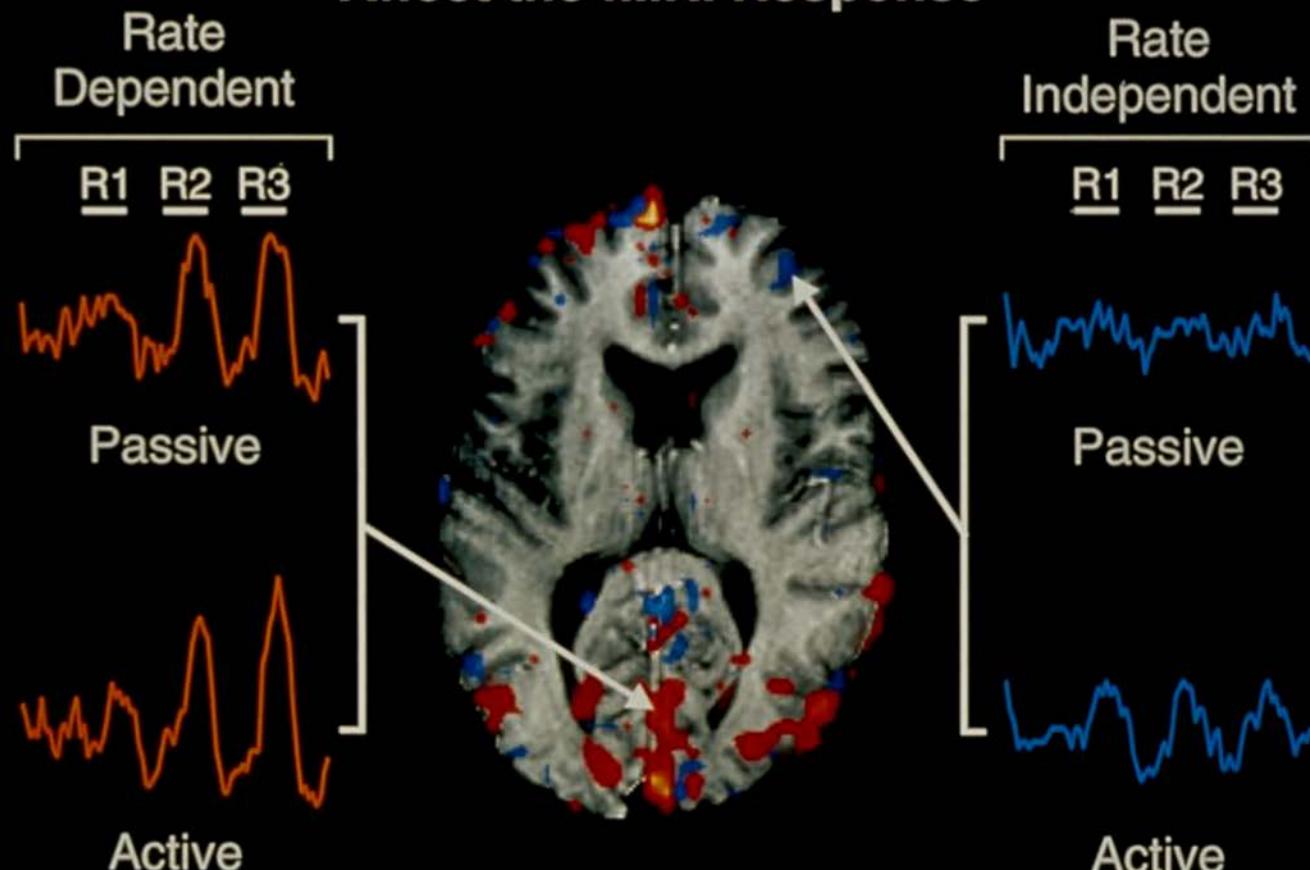
4. Single Event

5. Orthogonal Block Design

6. Free behavior Design.



## Both the Task and Presentation Rate Affect the fMRI Response



DeYoe et al.

# Neuronal Activation Input Strategies

1. Block Design

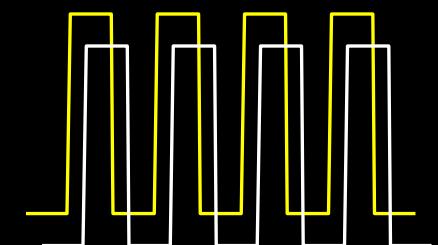
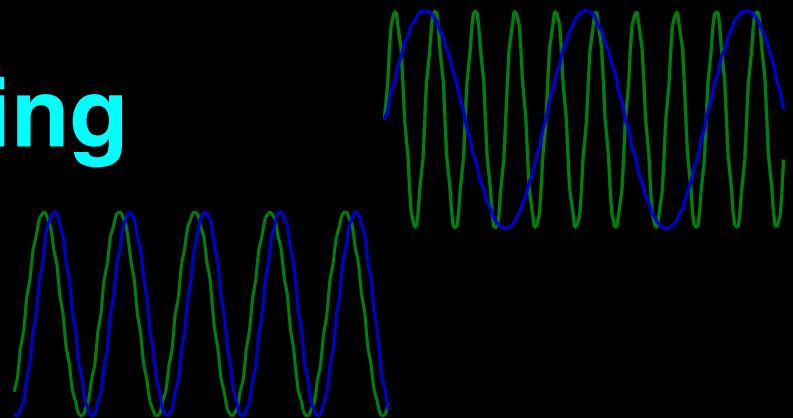
2. Frequency Encoding

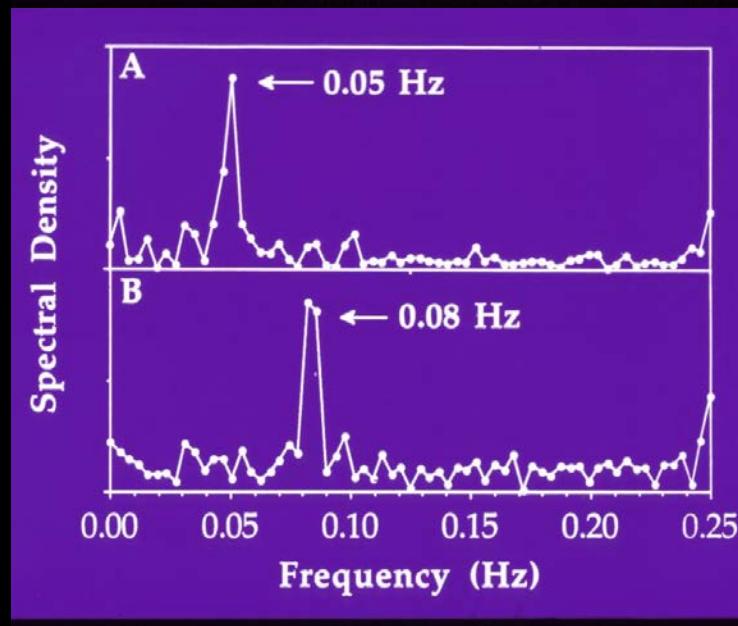
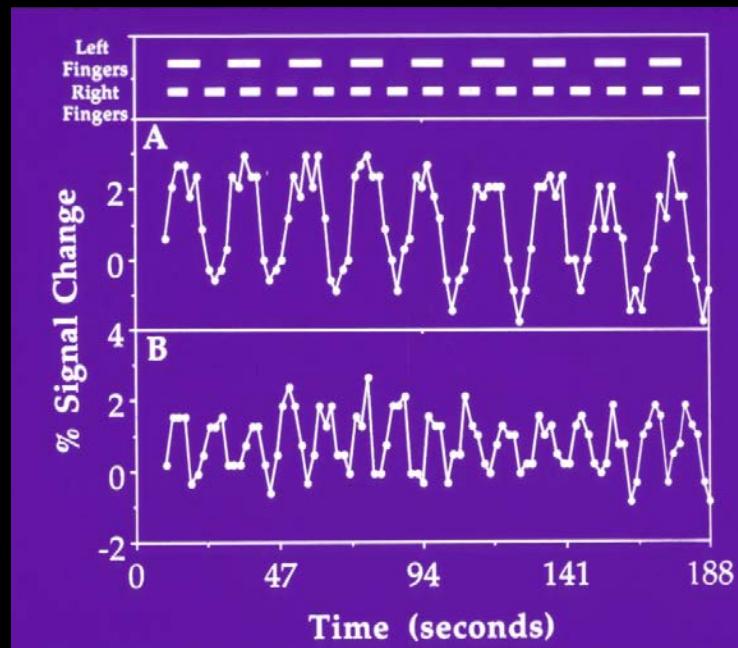
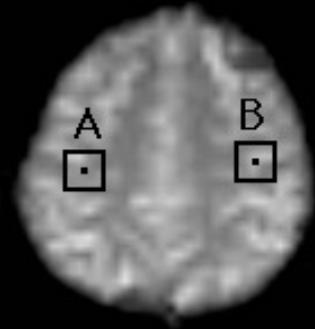
3. Phase Encoding

4. Single Event

5. Orthogonal Block Design

6. Free behavior Design.

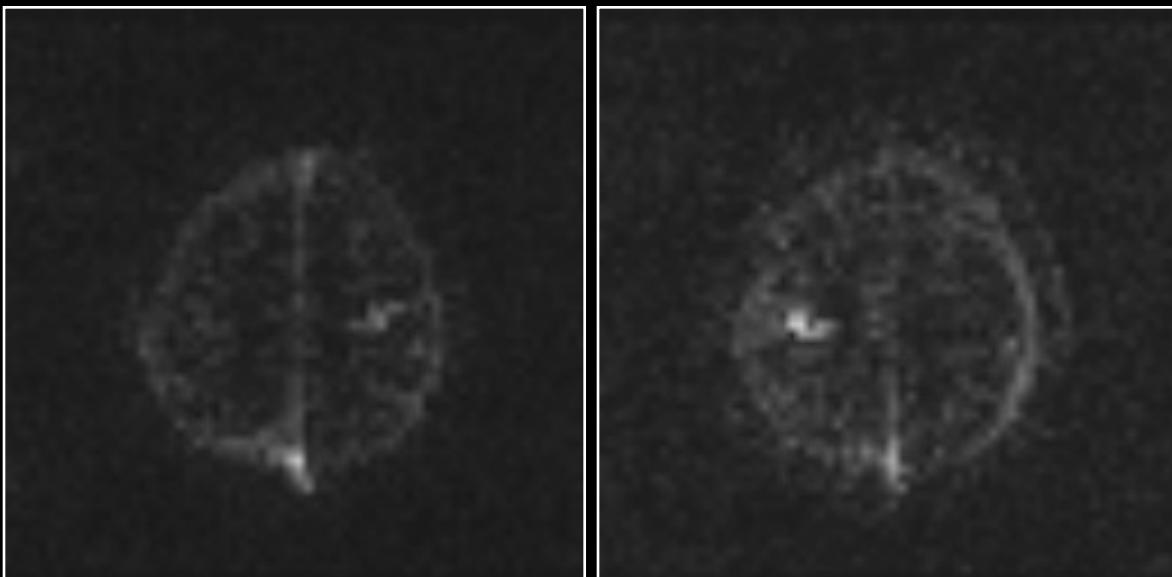




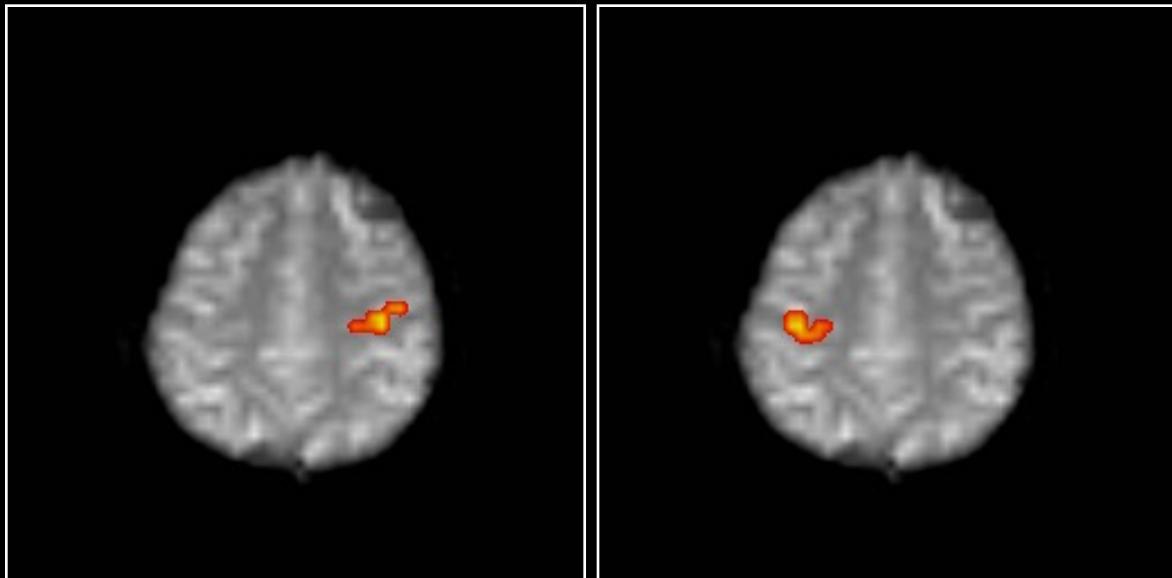
**0.08 Hz**

**0.05 Hz**

**spectral  
density**



**c.c. > 0.5  
with spectra**



# Neuronal Activation Input Strategies

1. Block Design

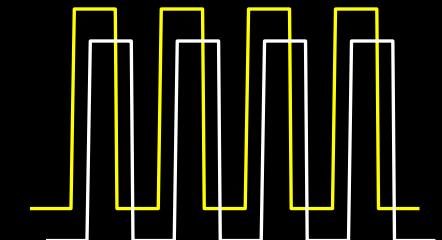
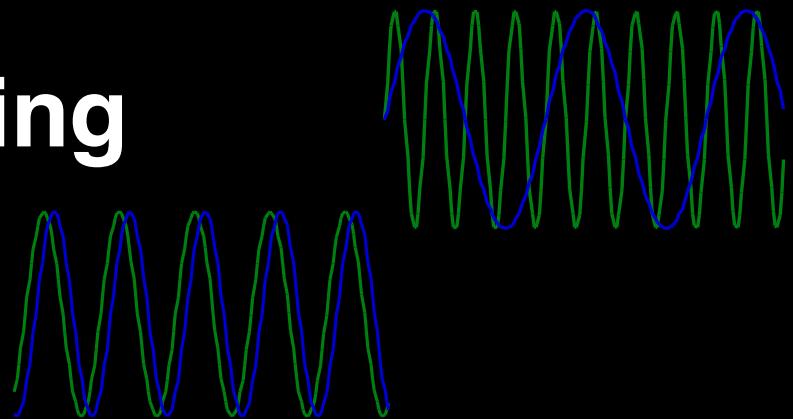
2. Frequency Encoding

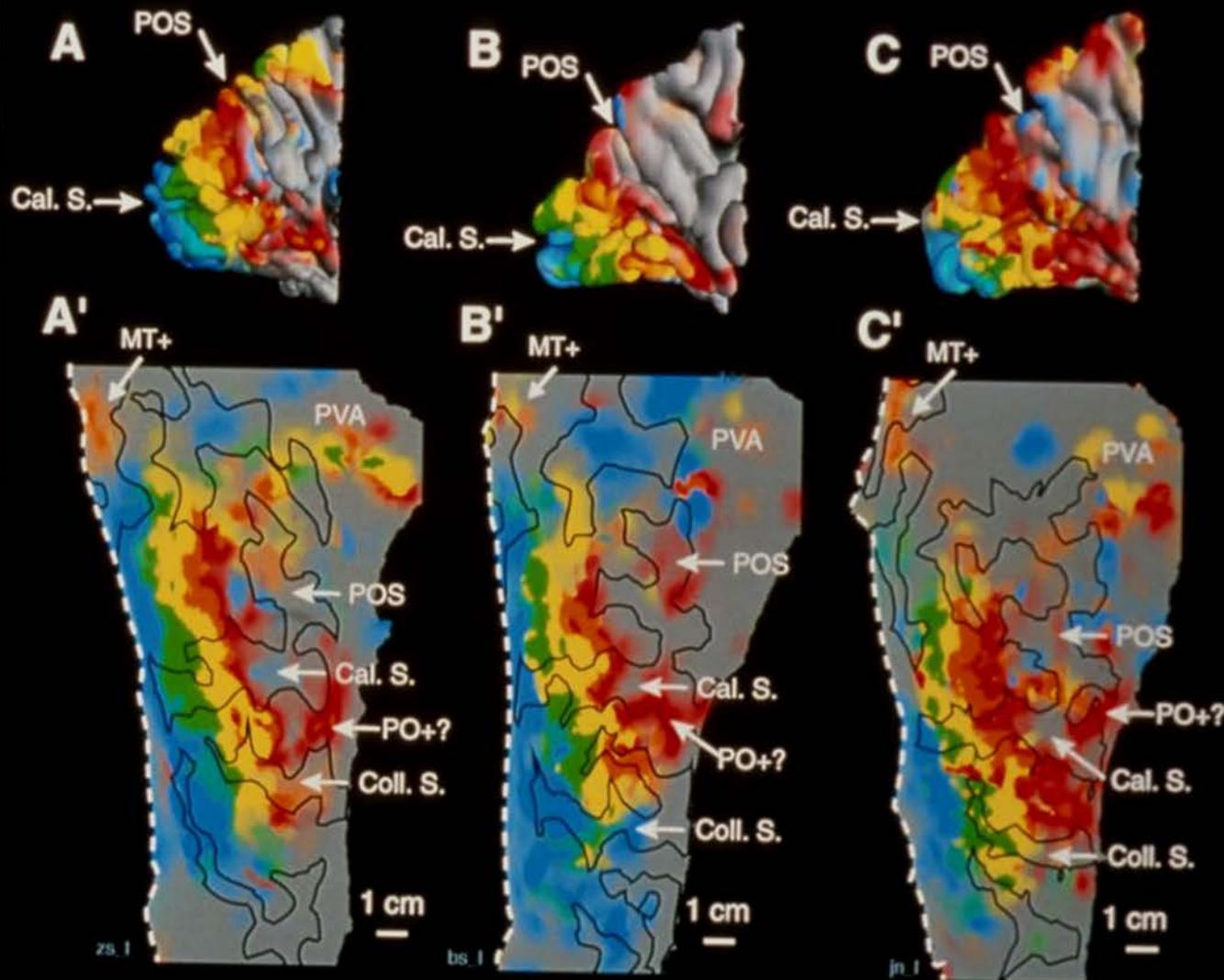
3. Phase Encoding

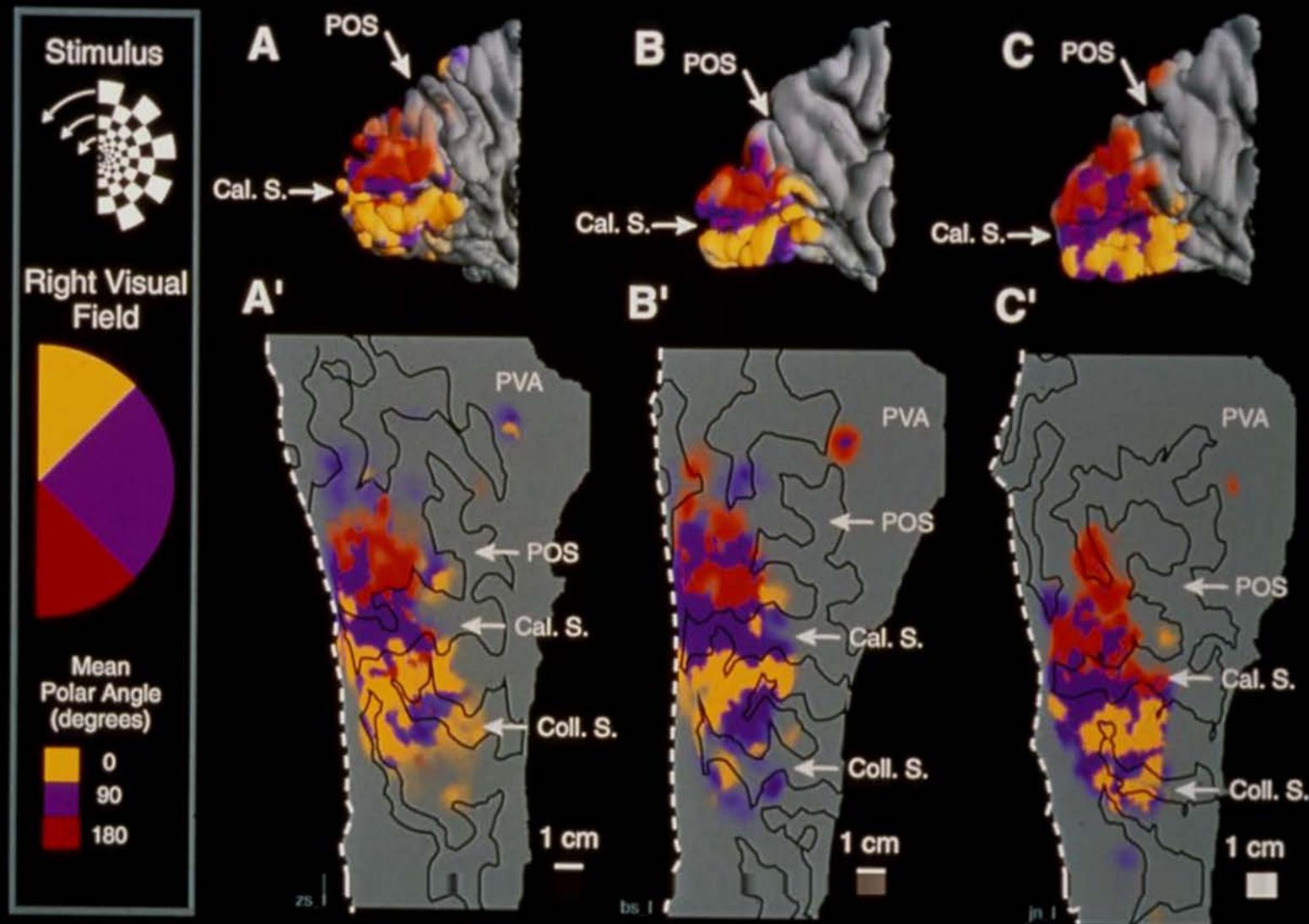
4. Single Event

5. Orthogonal Block Design

6. Free behavior Design.







# Neuronal Activation Input Strategies

1. Block Design

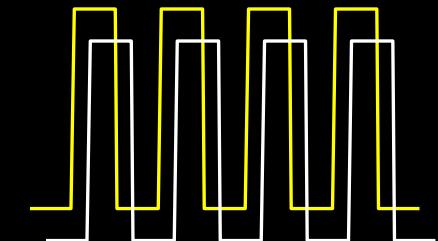
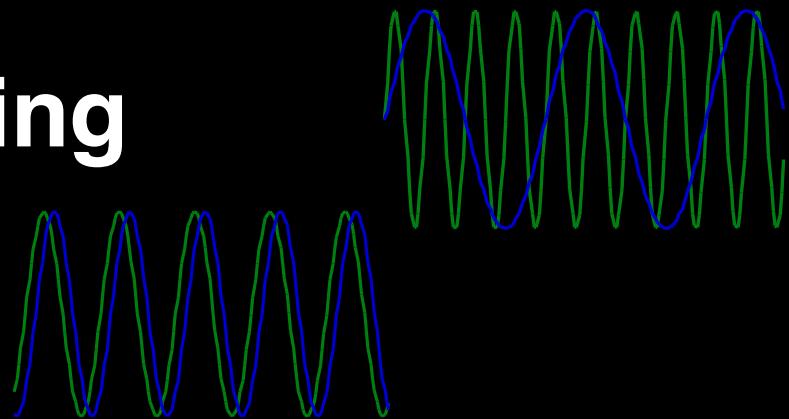
2. Frequency Encoding

3. Phase Encoding

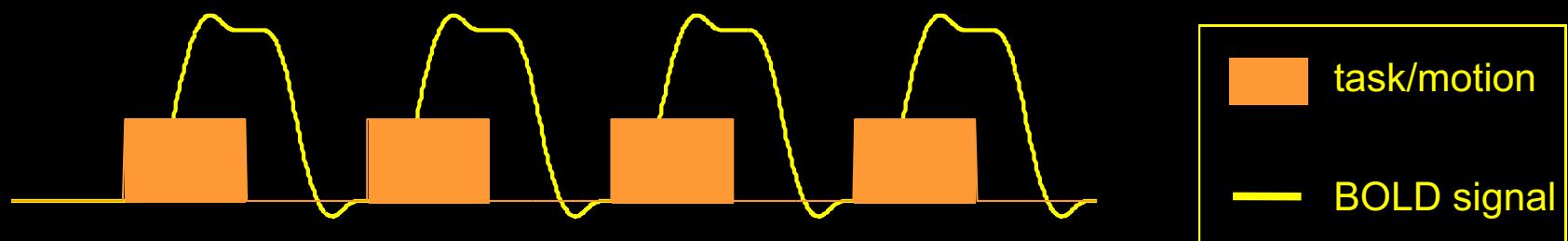
4. Single Event

5. Orthogonal Block Design

6. Free behavior Design.



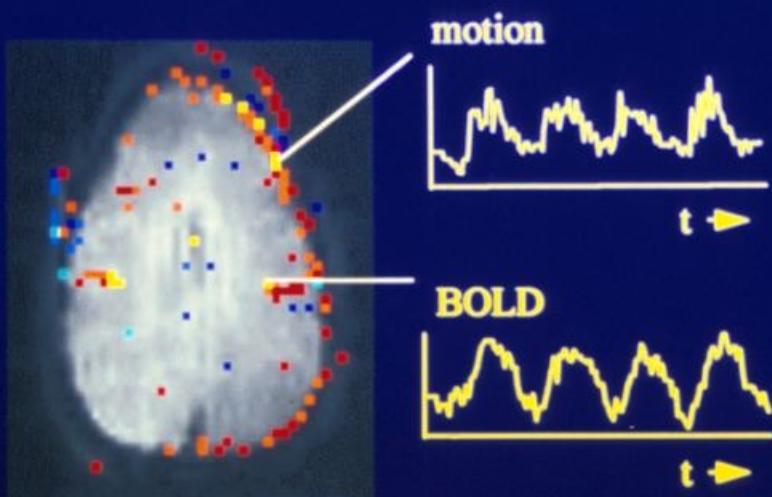
Block-trial



Single-trial (brief stimulus)

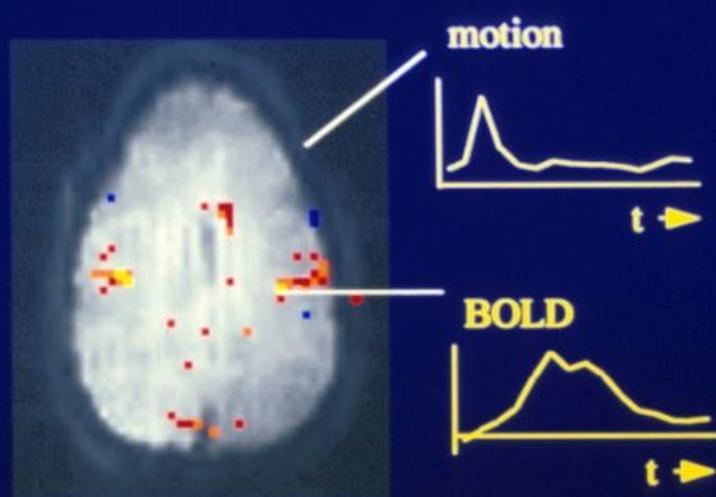


## Motion-Decoupled fMRI: Functional MRI during overt word production



### "block-trial" paradigm

Motion induced signal changes resemble functional (BOLD) signal changes

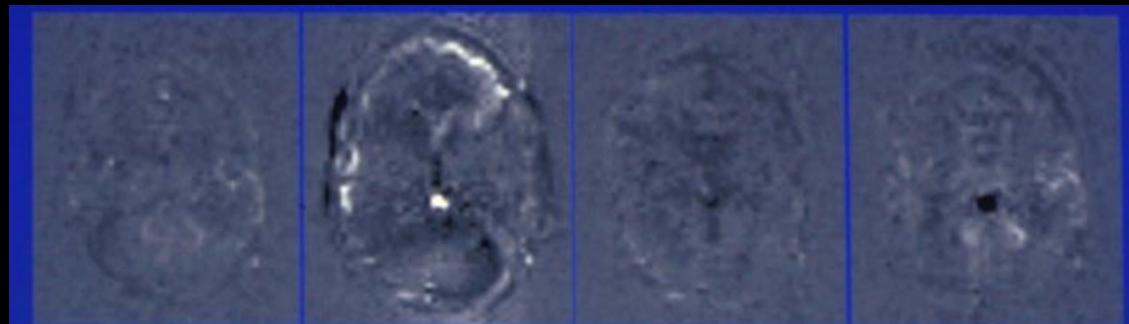


### "single-trial" paradigm

Motion induced and BOLD signal changes are separated in time

R.M. Birn, et al.

# Overt Word Production



2

3

4

5



6

7

8

9



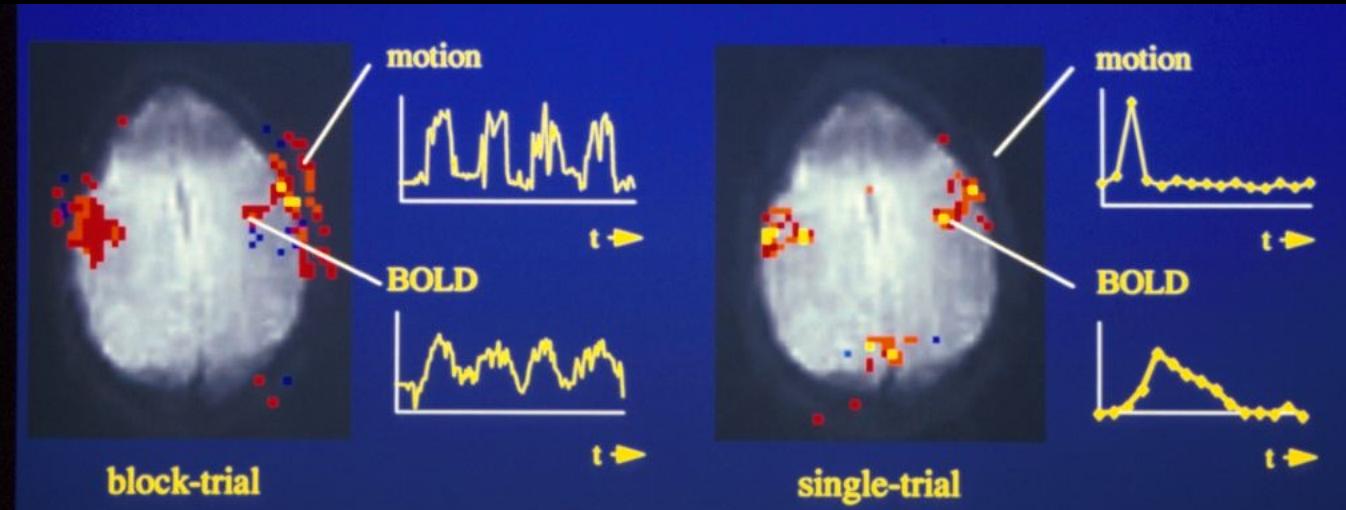
10

11

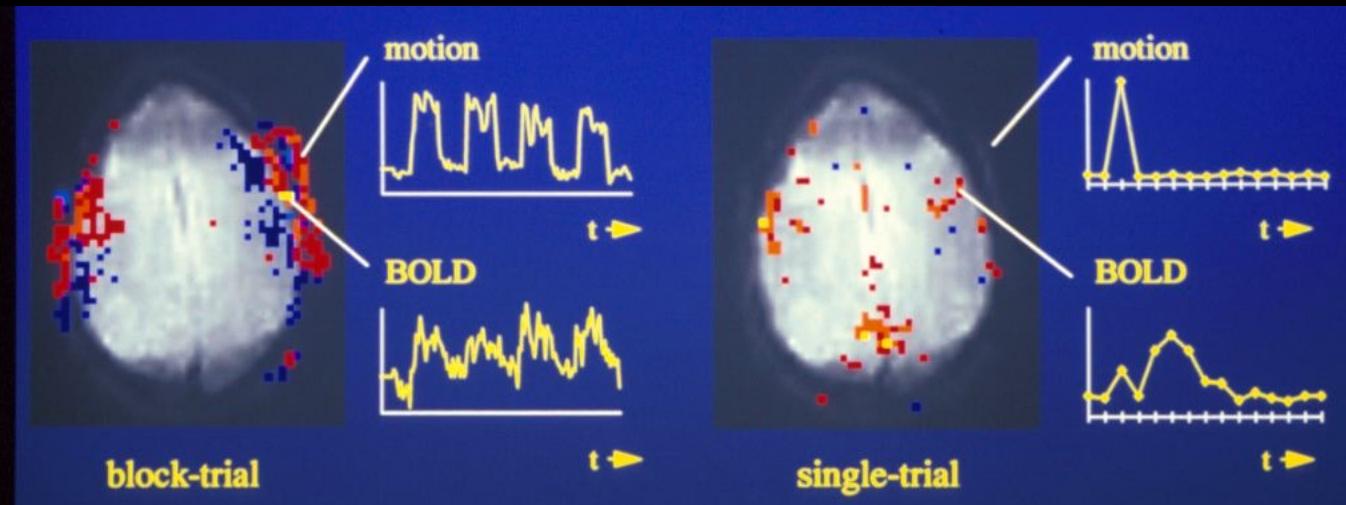
12

13

# Tongue Movement



# Jaw Clenching



# Neuronal Activation Input Strategies

1. Block Design

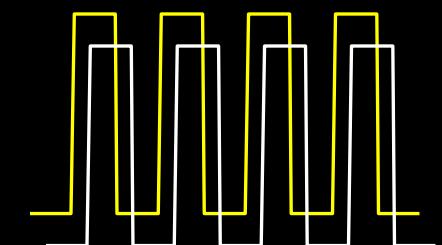
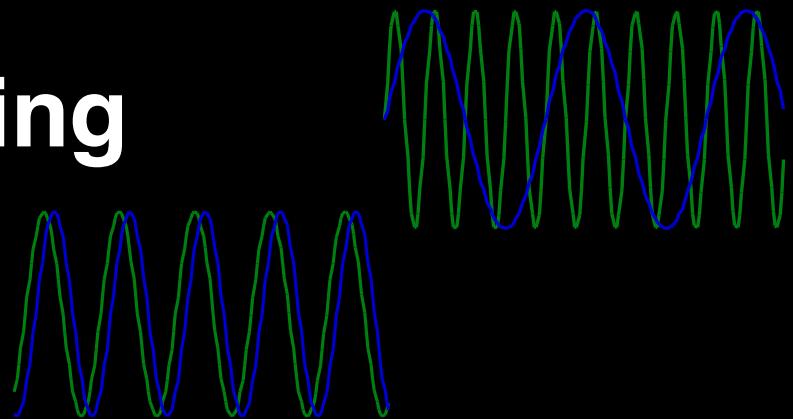
2. Frequency Encoding

3. Phase Encoding

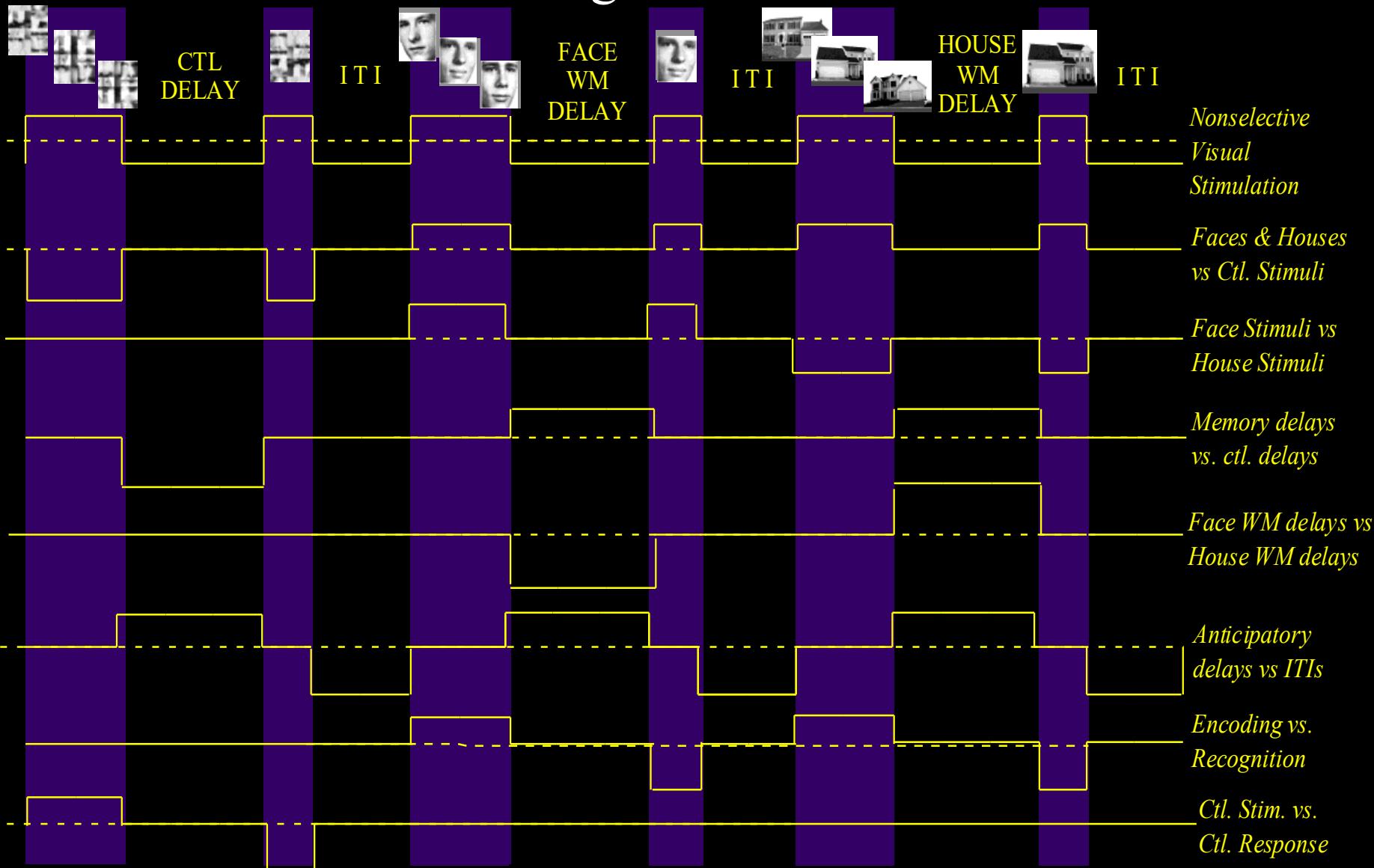
4. Single Event

5. Orthogonal Block Design

6. Free behavior Design.



# Example of a Set of Orthogonal Contrasts for Multiple Regression



# Neuronal Activation Input Strategies

1. Block Design

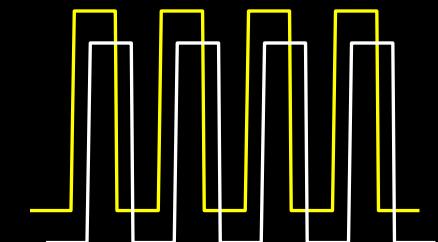
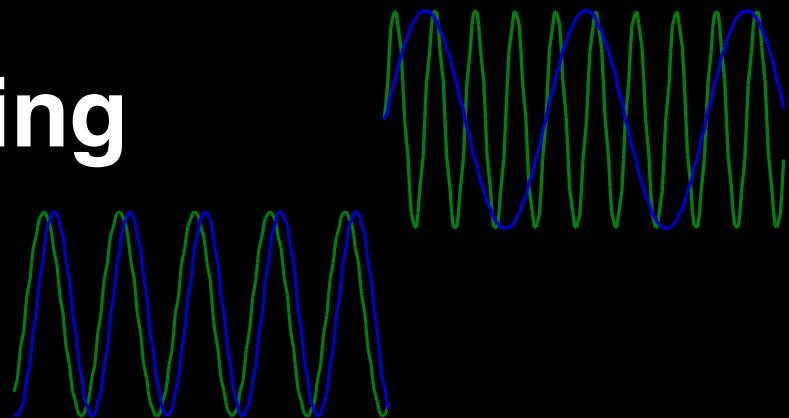
2. Frequency Encoding

3. Phase Encoding

4. Single Event

5. Orthogonal Block Design

6. Free behavior Design.

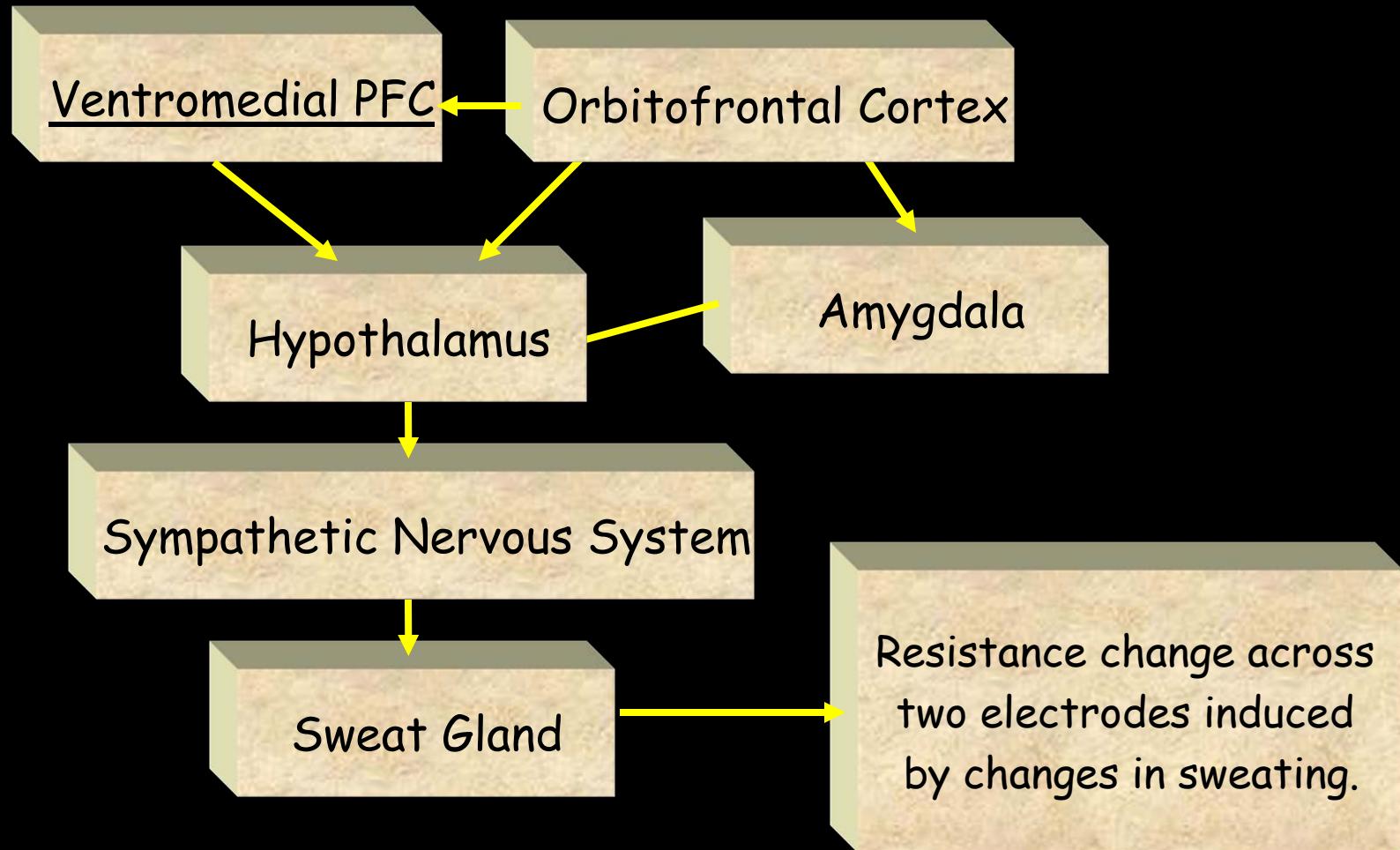


# Free Behavior Design

Use a continuous measure as a reference function:

- Task performance
- Skin Conductance
- Heart, respiration rate..
- Eye position
- EEG

# The Skin Conductance Response (SCR)



# Skin conductance data collection

- Equipment: UFI BioDerm Model 2701 Skin Conductance Meter, Slic-8000 8-channel A>D converter, Slic Software for Windows.
- Time from stim. to  $T_{1/2}$  :~6 to 10 s
- 4000mv range
- $0.1 \mu\text{S} = 500 \text{ mV}$  amplitude
- $0.05 \mu\text{S}$  threshold level: 250 mV
- $1 \mu\text{S} = 1 \text{ mmhos}$

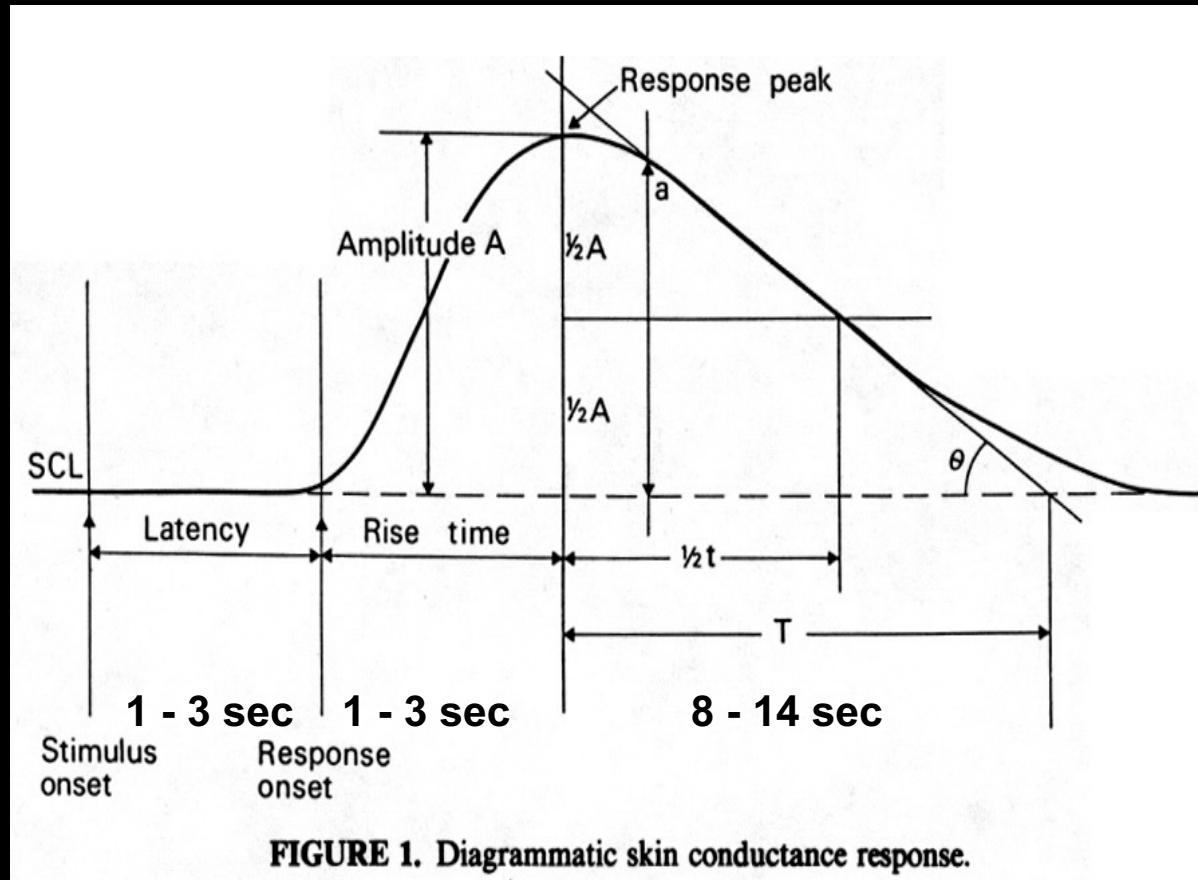
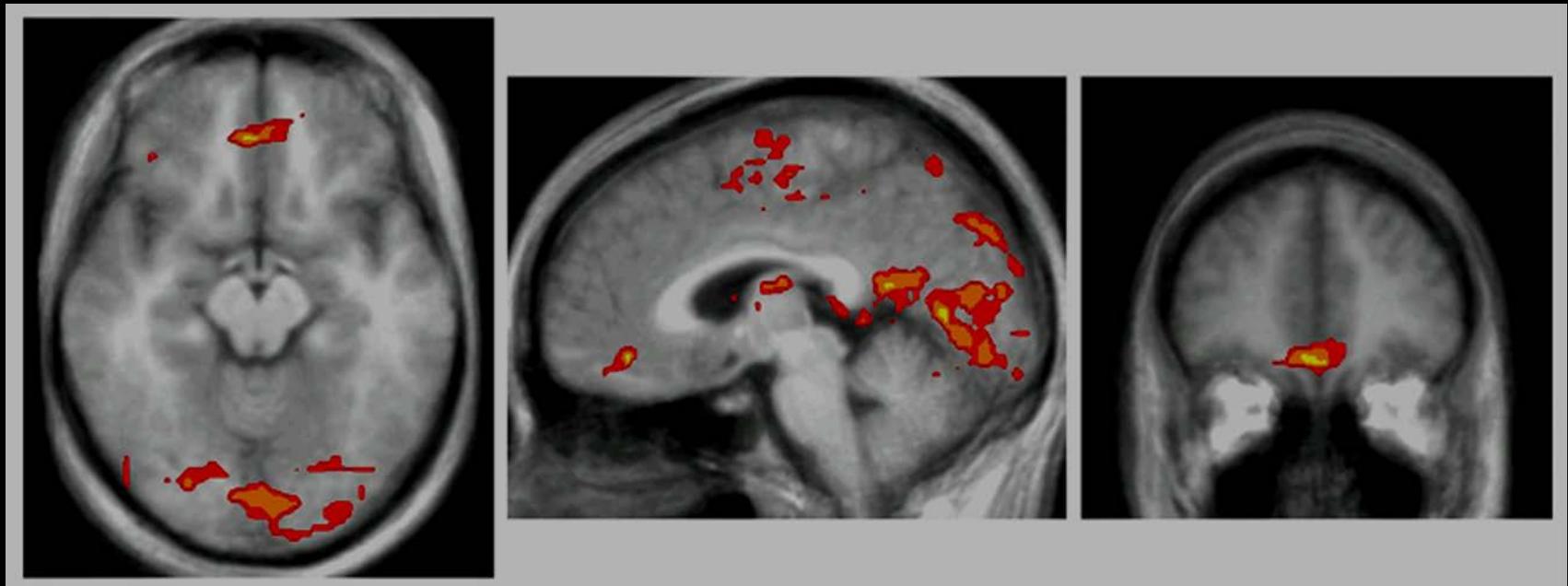


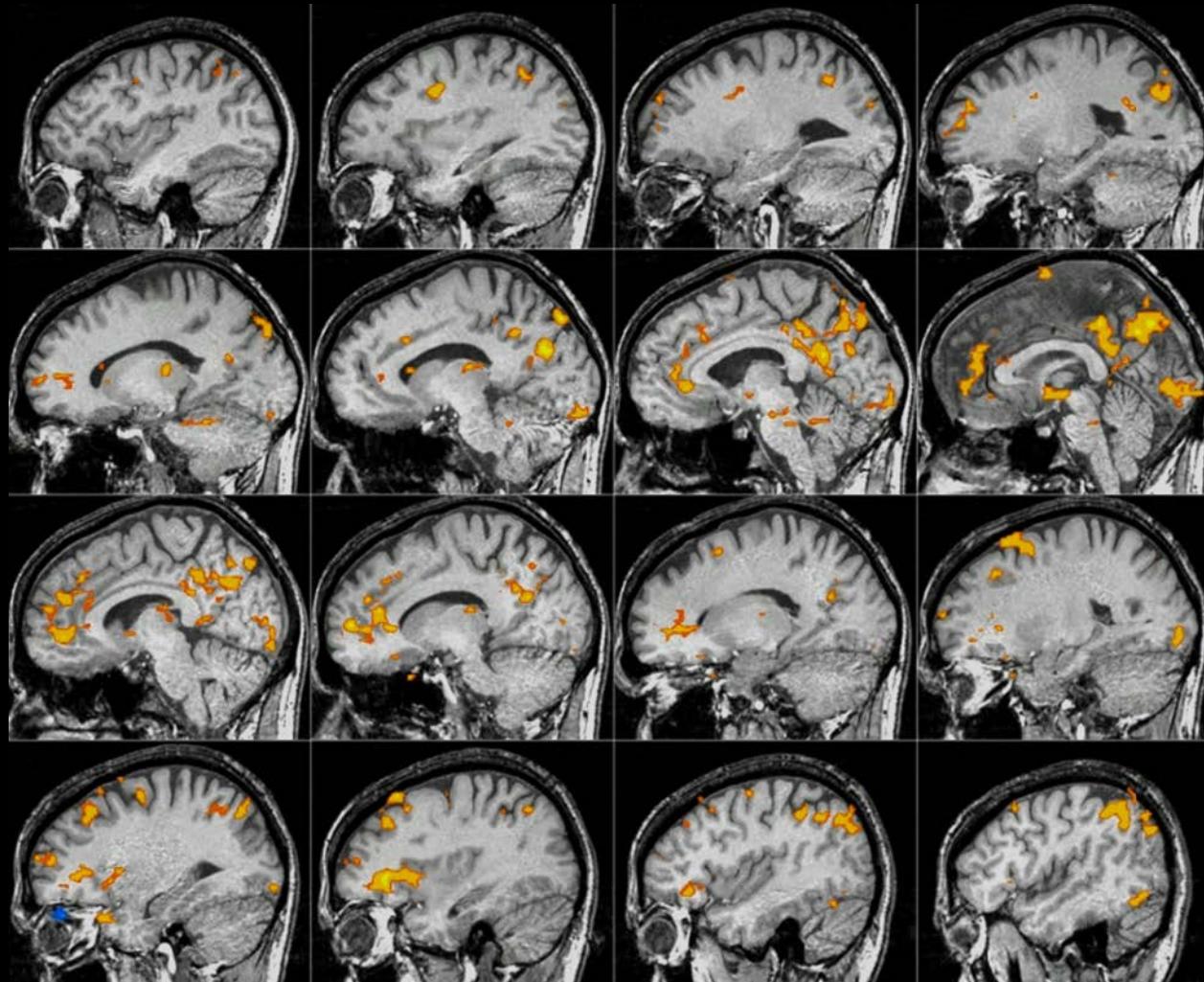
FIGURE 1. Diagrammatic skin conductance response.

- Boucsein, Wolfram (1992). Electrodermal Activity. Plenum Press, NY
- Venables, Peter, (1991). Autonomic Activity ANYAS 620:191-207.

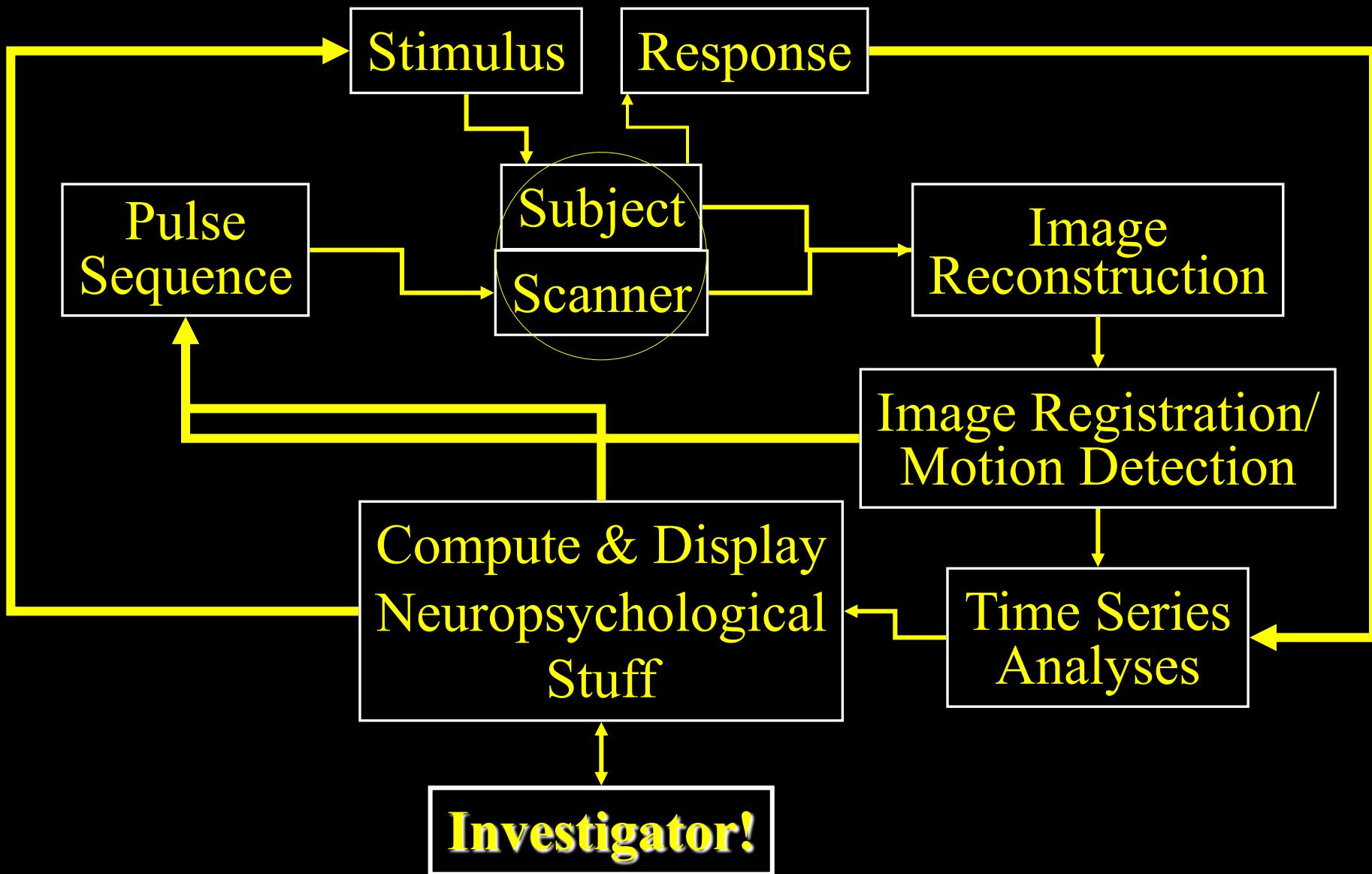
## Activity correlated with SCR changes



# Brain activity correlated with SCR during “Rest”



# Processing Stream with Real Time fMRI

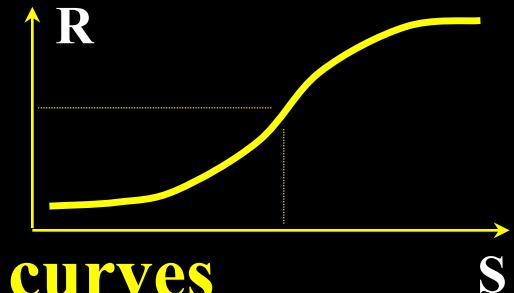


# Reasons for real time fMRI

- Make sure you have good data before subject leaves the scanner
- Repeat bad imaging runs
- Provide feedback to subject (*e.g.*, “stop nodding your head!”)
- Most important when dealing with patient populations
  - **when FMRI is used for pre-surgical planning**
  - **when patients in study are hard to come by**

# Further Reasons..

- Adjustment of stimulus level to reach a desired response magnitude
  - **½ of peak response**
  - **mapping of voxel stimulus-response curves**
- Carrying out experiment until some statistically significant result has been reached
  - **Must pay attention to statisticians for this!**
  - **e.g., do tasks until language lateralization has been established**

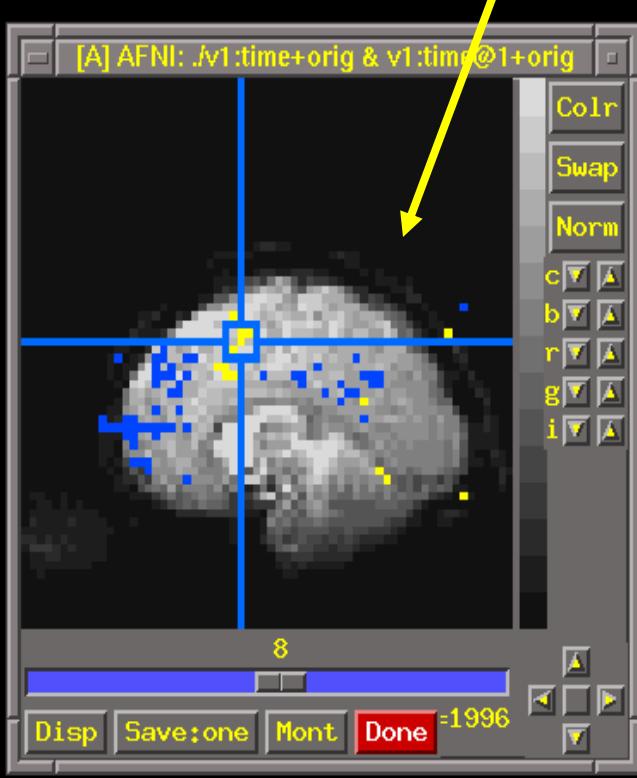


# Things to Look At (*à la AFNI*)

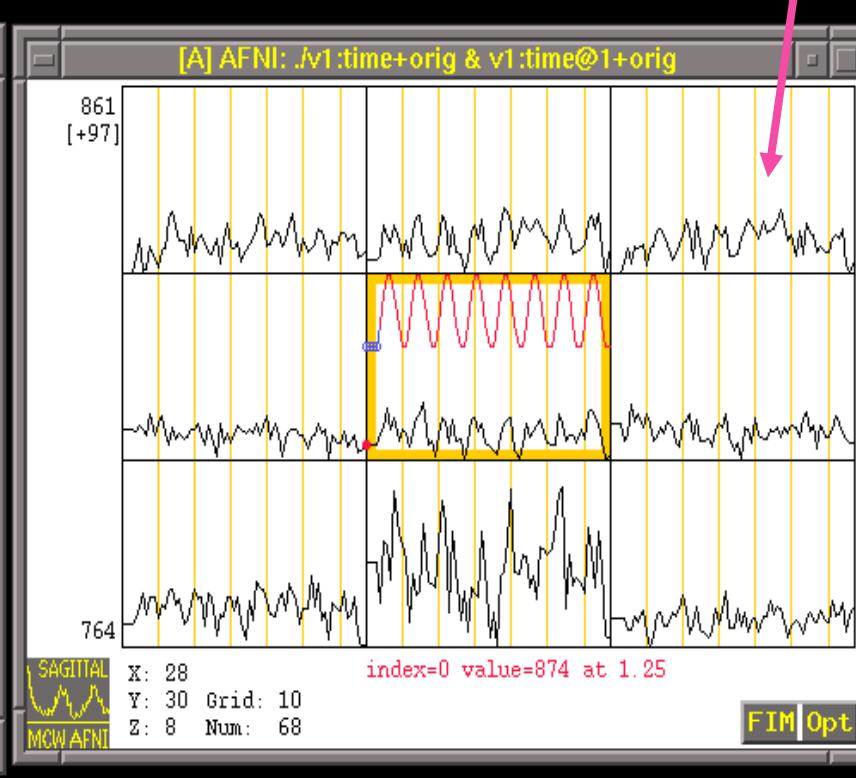
Control Panel



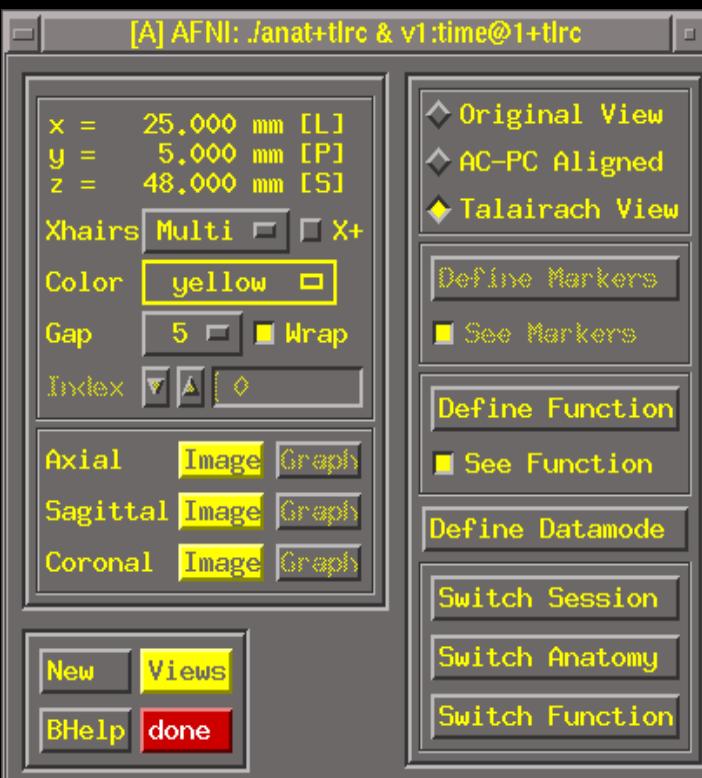
Displaying EP images from time series



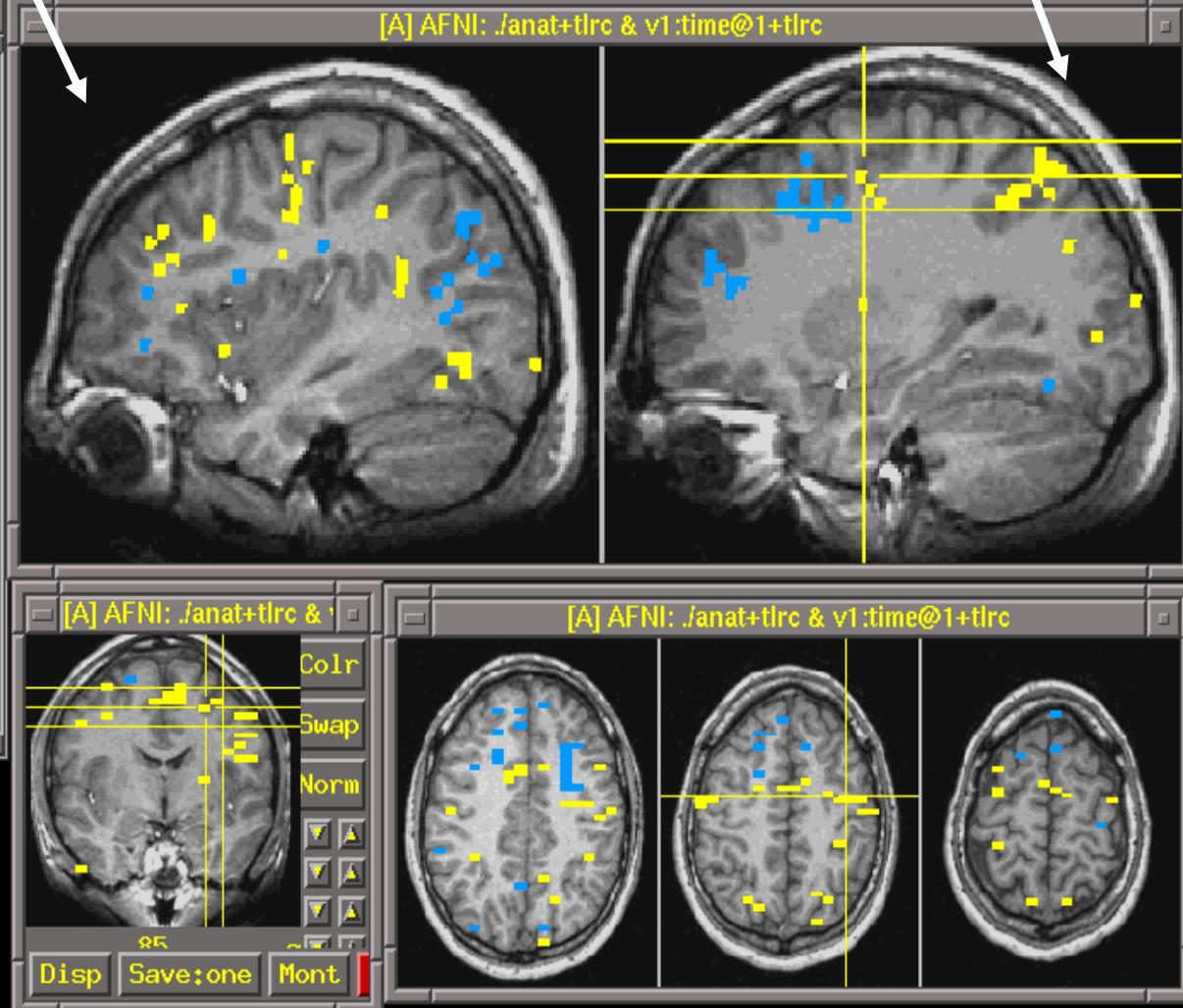
Graphing voxel time series data



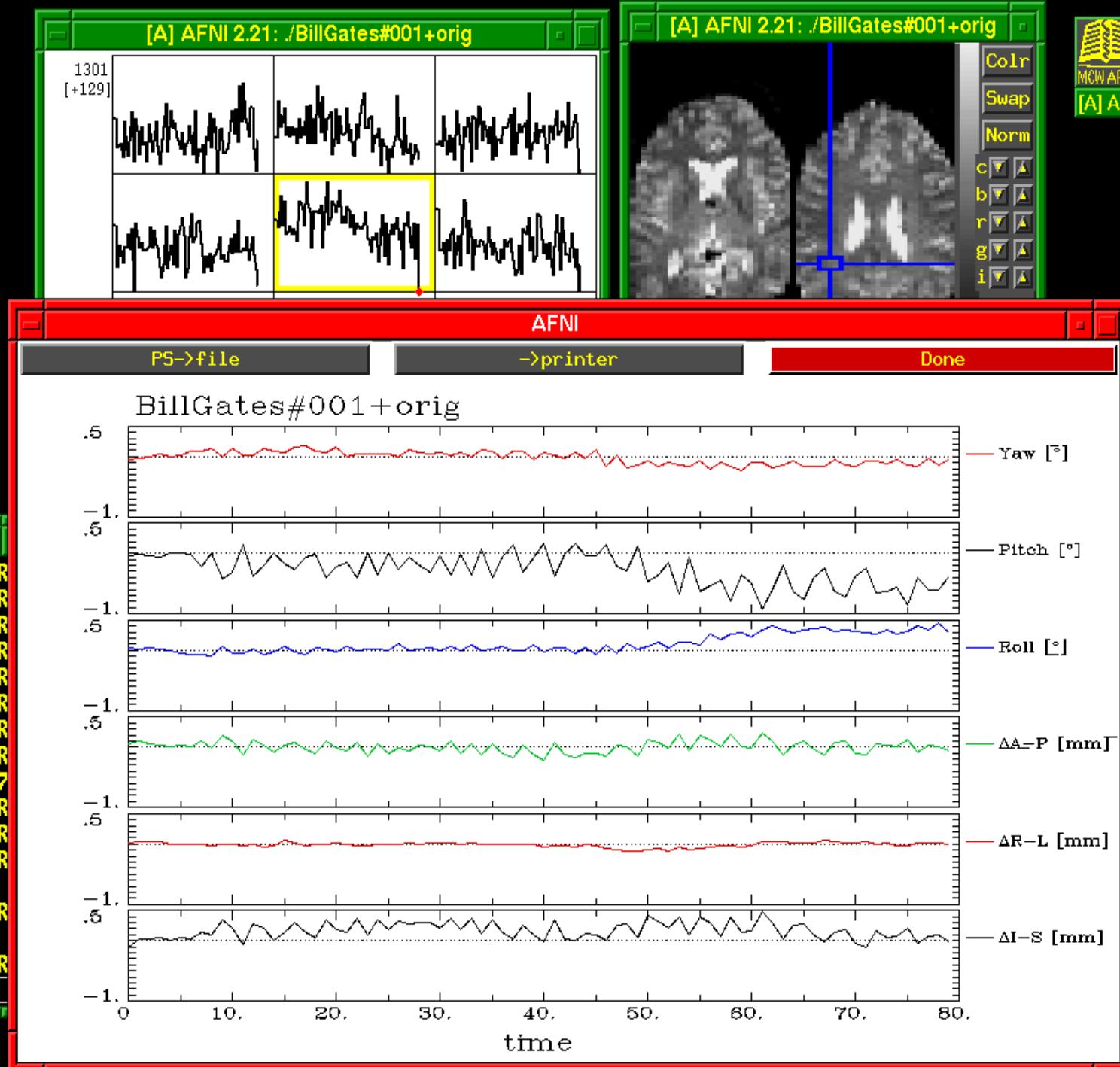
## Multislice layouts



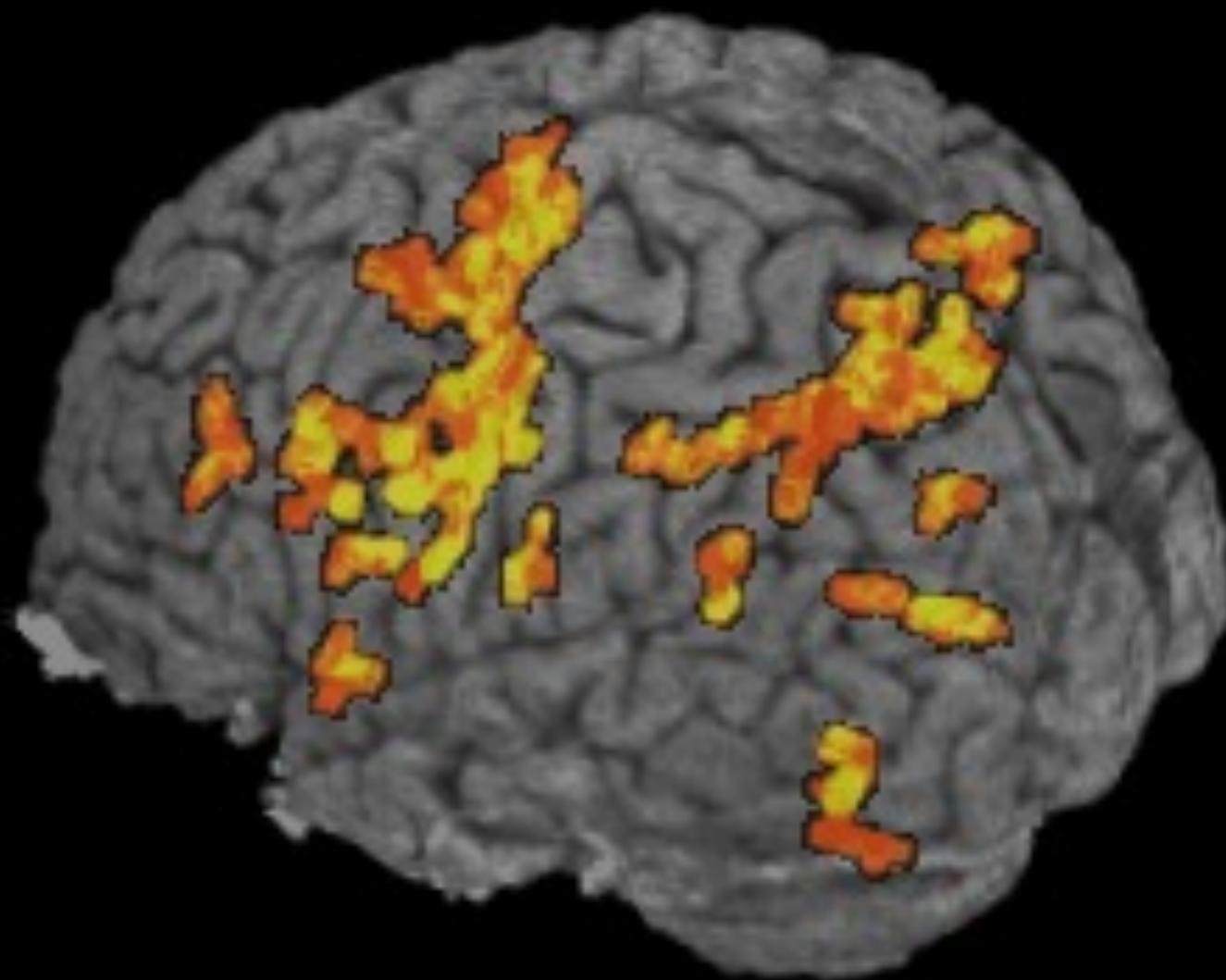
FIM overlaid on SPGR,  
in Talairach coords



# Estimated subject movement parameters



# End of Acquisition



< 1 s to render

Blocked trials:  
20 s on/20 s off  
8 blocks

Blocks: 1 2 3 4 5 6 7 8

Color shows  
through brain

Correlation > 0.45



# Functional Imaging Methods / 3T Group

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