

# fMRI as a Biomarker Reliability, QA, Multisite

Gary H. Glover

*Radiological Sciences Laboratory  
Center for Advanced MR Technology*

Stanford University



School of Medicine

Department of Radiology

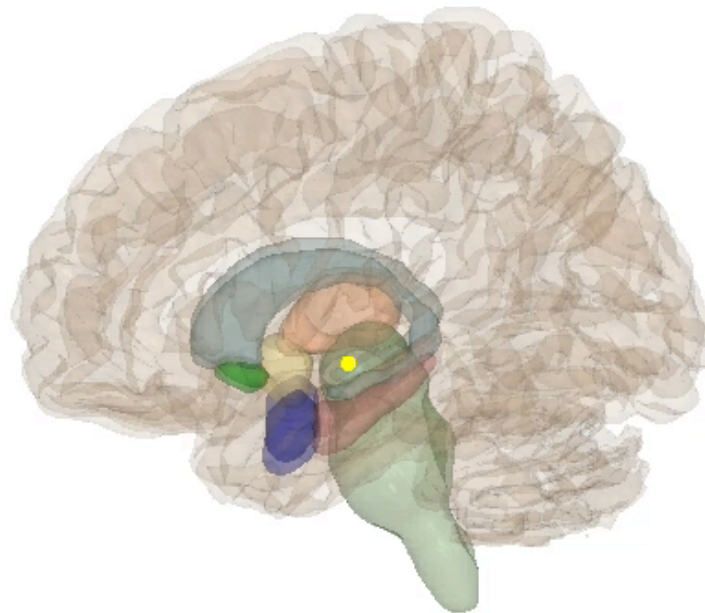


National Center for  
Research Resources

# The consistency problem

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- Where are the “emotion regions?”
- Look at coordinates reported in published studies of emotion:

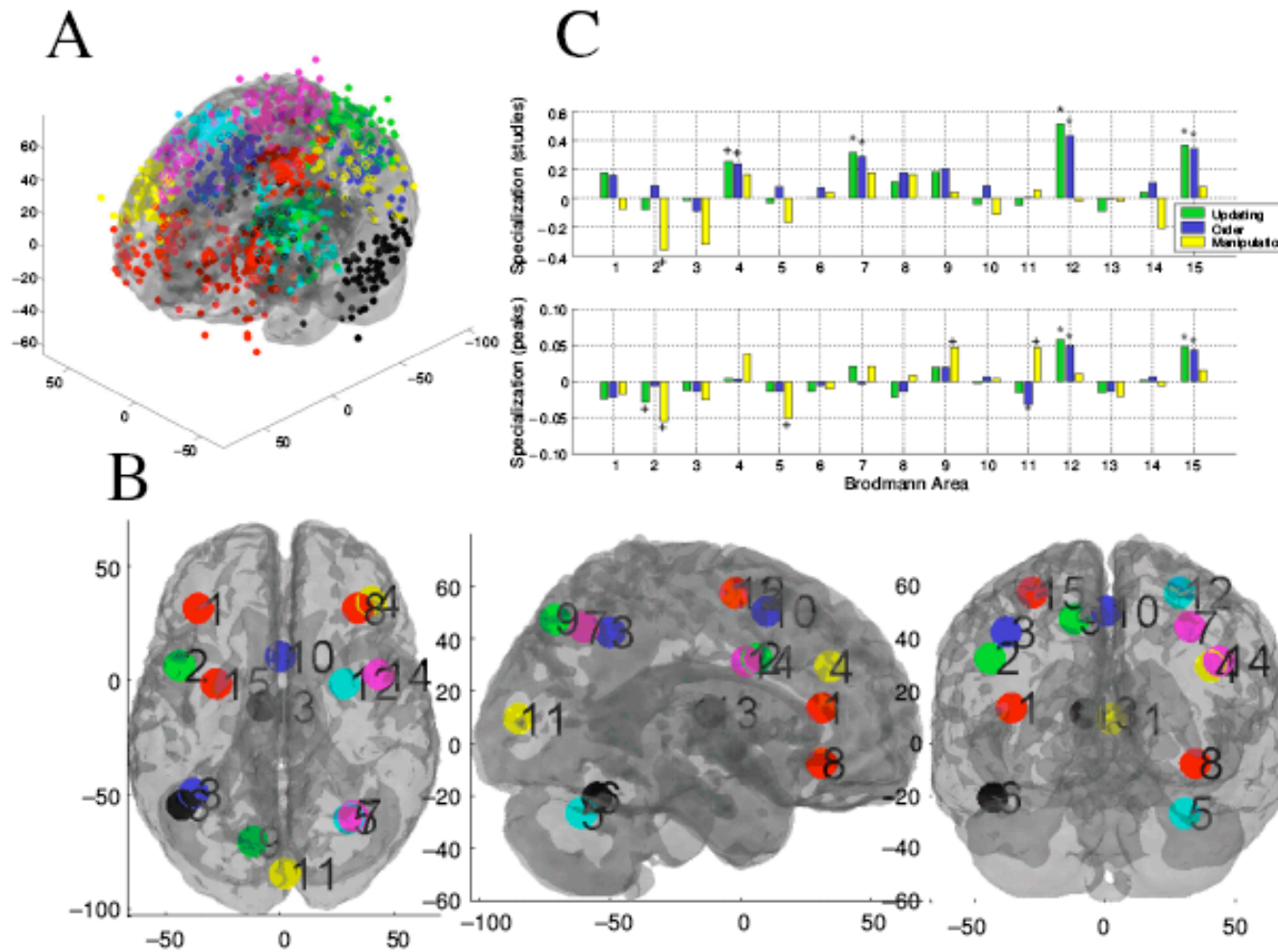


**163 studies of emotion**

**Slide courtesy  
Tor Wager**



# Consistency: fMRI of WM



60 PET/fMRI  
studies  
TD Wager, 2003

*The Scientist*, July 19, 2004 v18 i14 p64(1)

**Fake Method for Research Impartiality (fMRI):** behavioral sciences  
bid for enhanced status falls short. (Closing Bell) *Sam Jaffe.*

**Full Text:** COPYRIGHT 2004 Scientist Inc.

For decades, the behavioral sciences have been at a dramatic disadvantage to the hard sciences. When a biologist hypothesizes that the addition of a particular ligand to a cell will cause a certain gene to turn on and thus produce a certain protein, all she has to do is to introduce the enzyme and then test for the protein. If it's there, she publishes a paper; if it's not, she quietly discards the work.

The psychologist has a much steeper hill to climb. Let's say he's trying to prove his hypothesis that most people who hate their fathers also secretly desire their mothers. Relying on the subject to tell you how he feels has too many obvious landmines that can corrupt the data. How can the psychologist scientifically prove that the connection exists?

Well, now he can. Or at least he can claim that it's a provable hypothesis. Thanks to fMRI (functional magnetic resonance imaging), dozens of studies are pouring out of the humanities aisle of academia claiming that the yellow and red blotches on fMRI scans reveal scientific evidence that can be used to

# Outline

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- **Issues with fMRI reliability**
- Reducing confounds
  - HRF
  - calibration of vasoreactivity
  - latency
- Physiological noise
- Multicenter studies

# fMRI as a biomarker: Motivation

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Examples where quantifying activation may be important in drawing inferences about cognition:

- Inter-group comparisons  
Age, health
- Longitudinal studies  
normal/abnormal development, therapy
- Multi-center studies  
fBIRN schizophrenia fMRI trial



# Working Memory

Children

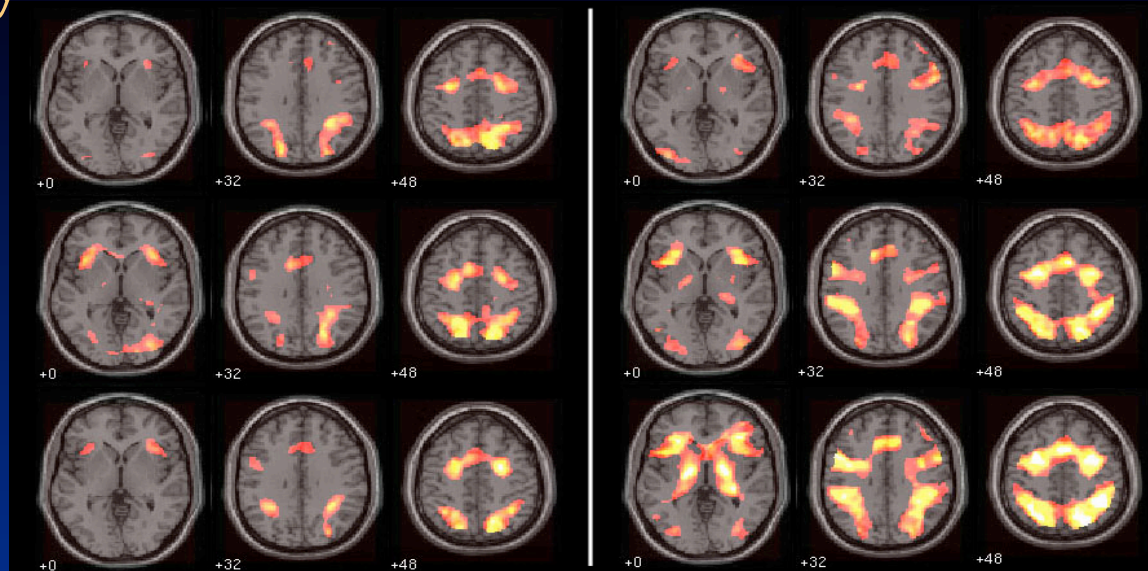
Adults

Spatial

low

medium

high

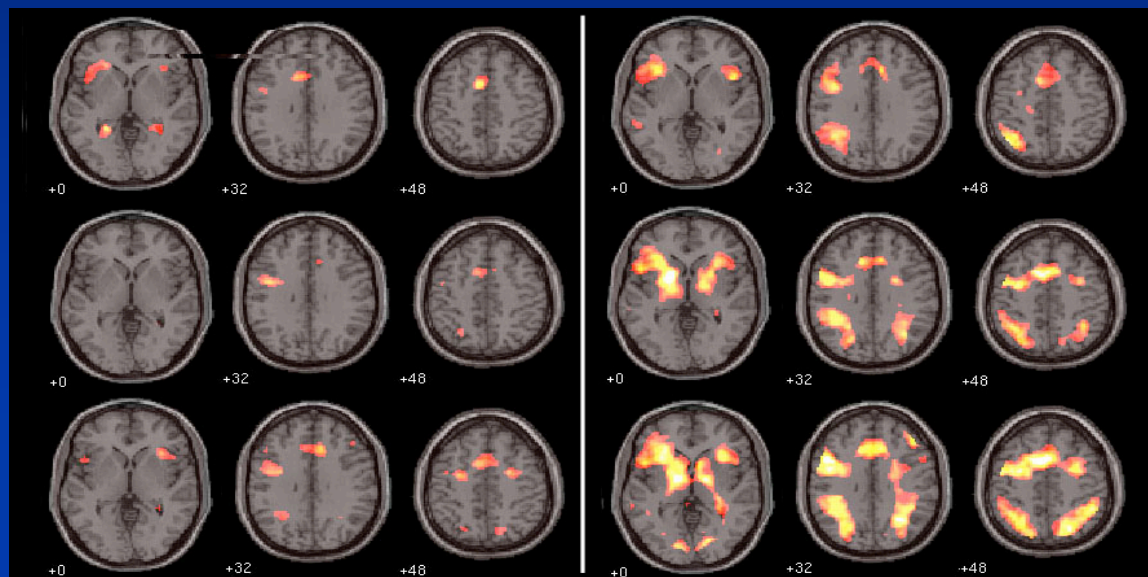


Verbal

low

medium

high



# Variance in fMRI

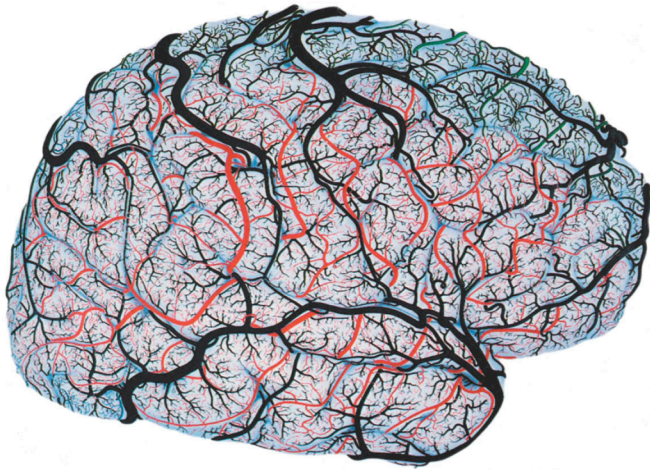
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- inter-subject variability (probably what you want)
- inter-trial variability (attention, behavior)
- inter-run/session variability (attention, behavior, scanner)
- hemodynamic confounds (calibration)
- physiologic noise (measure and remove)
- small effect size (average)
- task design (control for unrelated effects)
- a lot more...

# fMRI Calibration: Motivation

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What's the problem?



# Vascular response to upregulated metabolism

$\uparrow \text{CMRO}_2 \rightarrow$

$\uparrow [\text{CO}_2], \uparrow [\text{Hb}], \downarrow [\text{HbO}_2]$

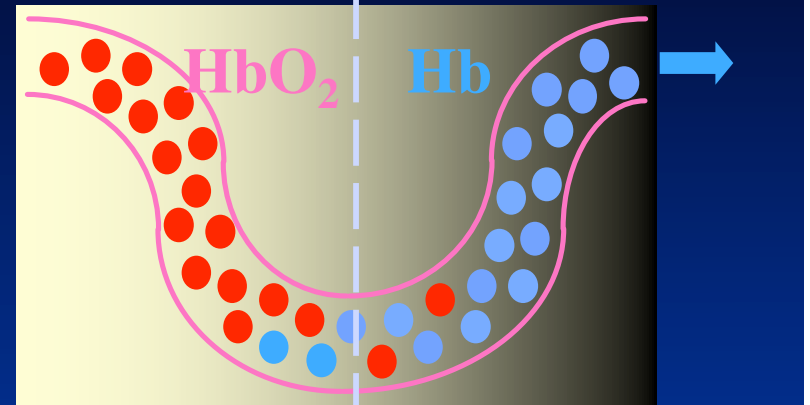
$\rightarrow \uparrow \text{rCBF}, \text{rCBV}$

$\rightarrow \uparrow [\text{HbO}_2]$

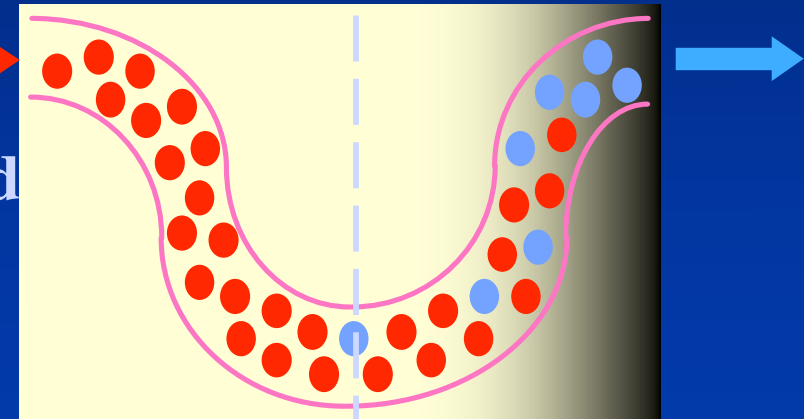
$\rightarrow \uparrow \text{T2}, \text{T2}^*$

$\rightarrow \text{BOLD contrast}$

resting state



stimulated





# BOLD Contrast

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**∴ BOLD signal is an epiphenomenological indicator of neural processing: many confounds to quantification**

- **HRF characteristics**

**Amplitude**

**-> calibration**

**Latency**

**Baseline rCBF**

- **Physiological noise**

**cardiac pulsation**

**-> denoising**

**respiration**

**head motion**

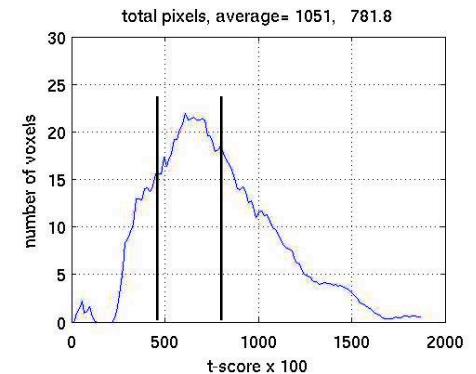
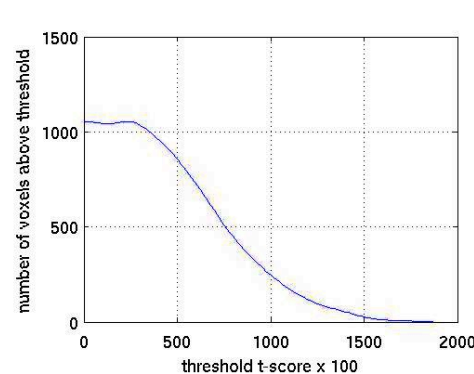
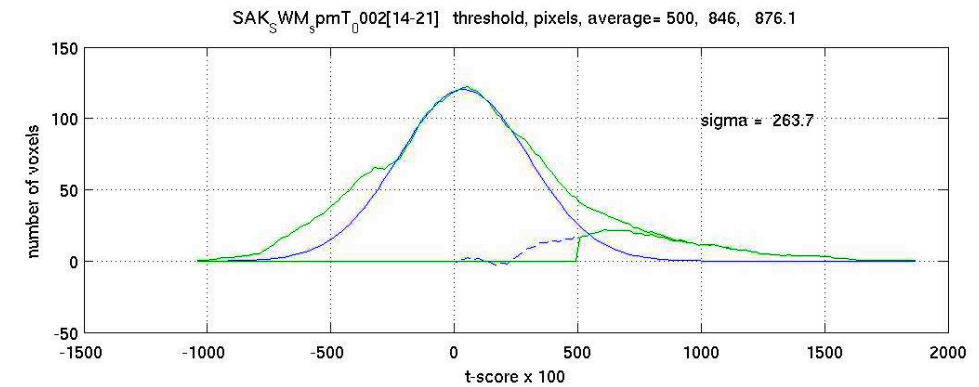
# Activation map derives from thresholding a statistical estimate of BOLD CNR:

$$y_{meas}(t) = \beta_{exp} d_{exp}(t) + \beta_{cntl} d_{cntl}(t) + \beta_0 + \varepsilon(t)$$

$$GLM \Rightarrow \beta' s$$

$$T = \frac{\beta_{exp} - \beta_{cntl}}{\sigma} = \frac{effect}{resid}$$

$$T_{crit} = tpdf(p, df)$$



## What does it mean?

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Does “activation”  
= metabolic up-regulation consequent to  
neural firing?

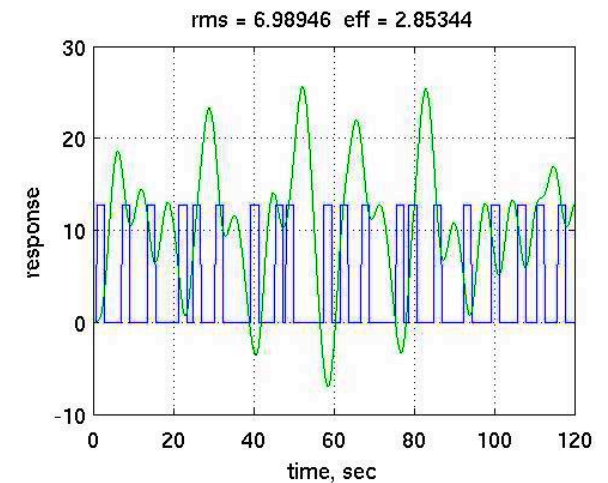
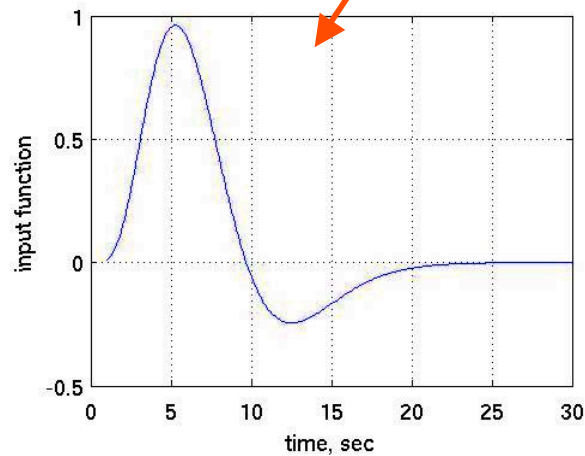
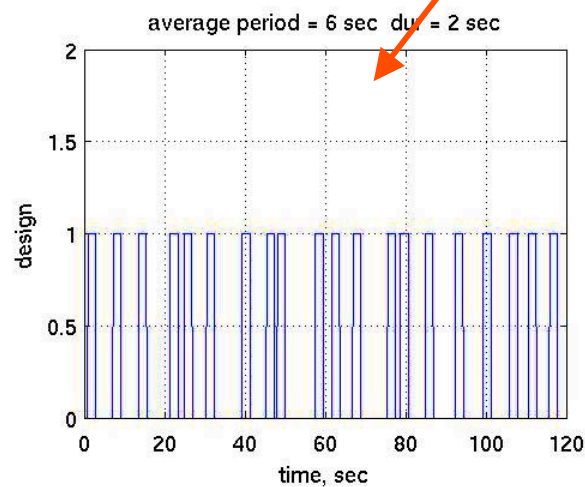
$$y_{meas}(t) = \beta d(t) + \varepsilon(t)$$

No, not directly... HRF is in the way

$$y_{meas}(t) = \beta(d(t) * h(t)) + \varepsilon(t)$$

# General Linear Model

$$y = (\beta_1 d_1 + \beta_2 d_2 + \beta_3 d_3 \cdots + \beta_n d_n) * h + \beta_0 + \tilde{n}$$



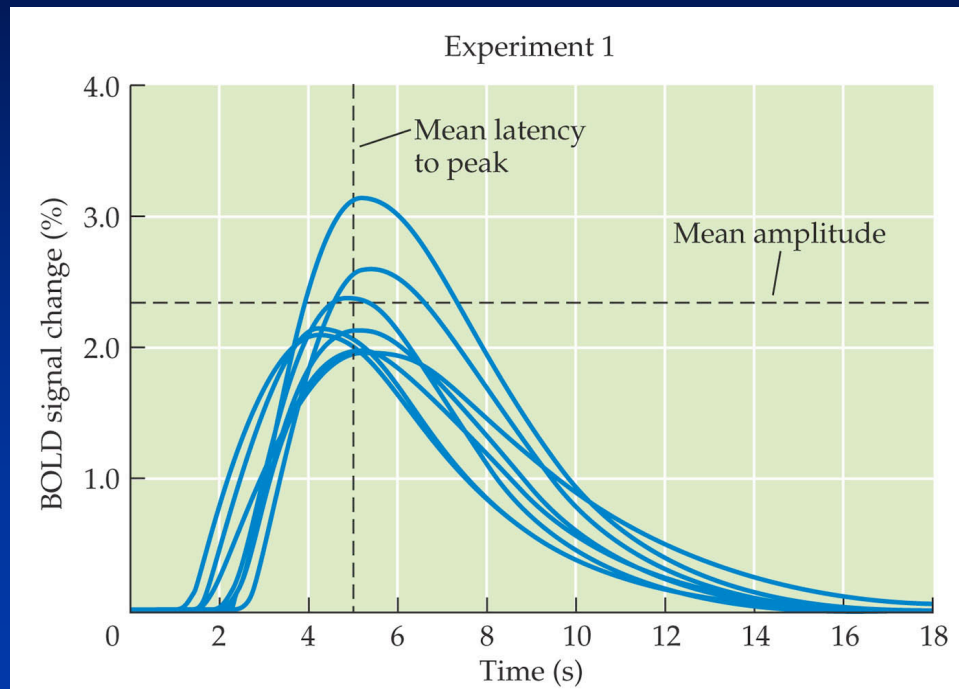


# Hemodynamic Response Function

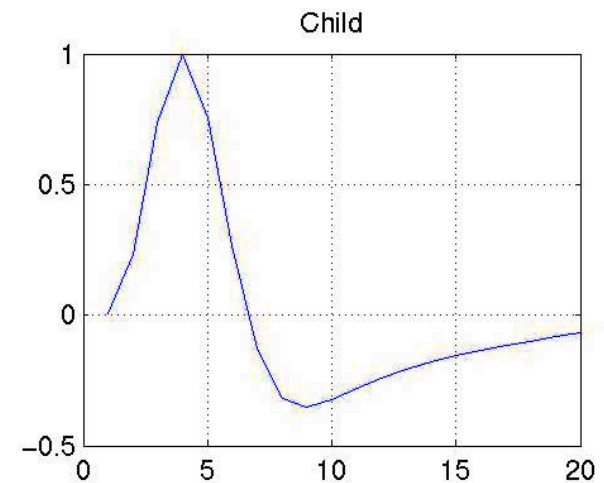
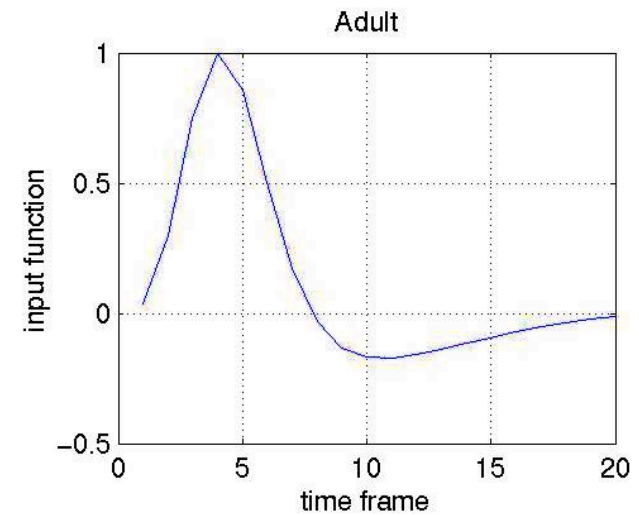
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- **Definition: BOLD response to an impulsive stimulus**
- **may include neuronal and vascular responses**
  - > **use a cognitively simple task to reduce neuronal component**
- **may be nonlinear**
  - > **superposition does not hold**

# Variability of HRF

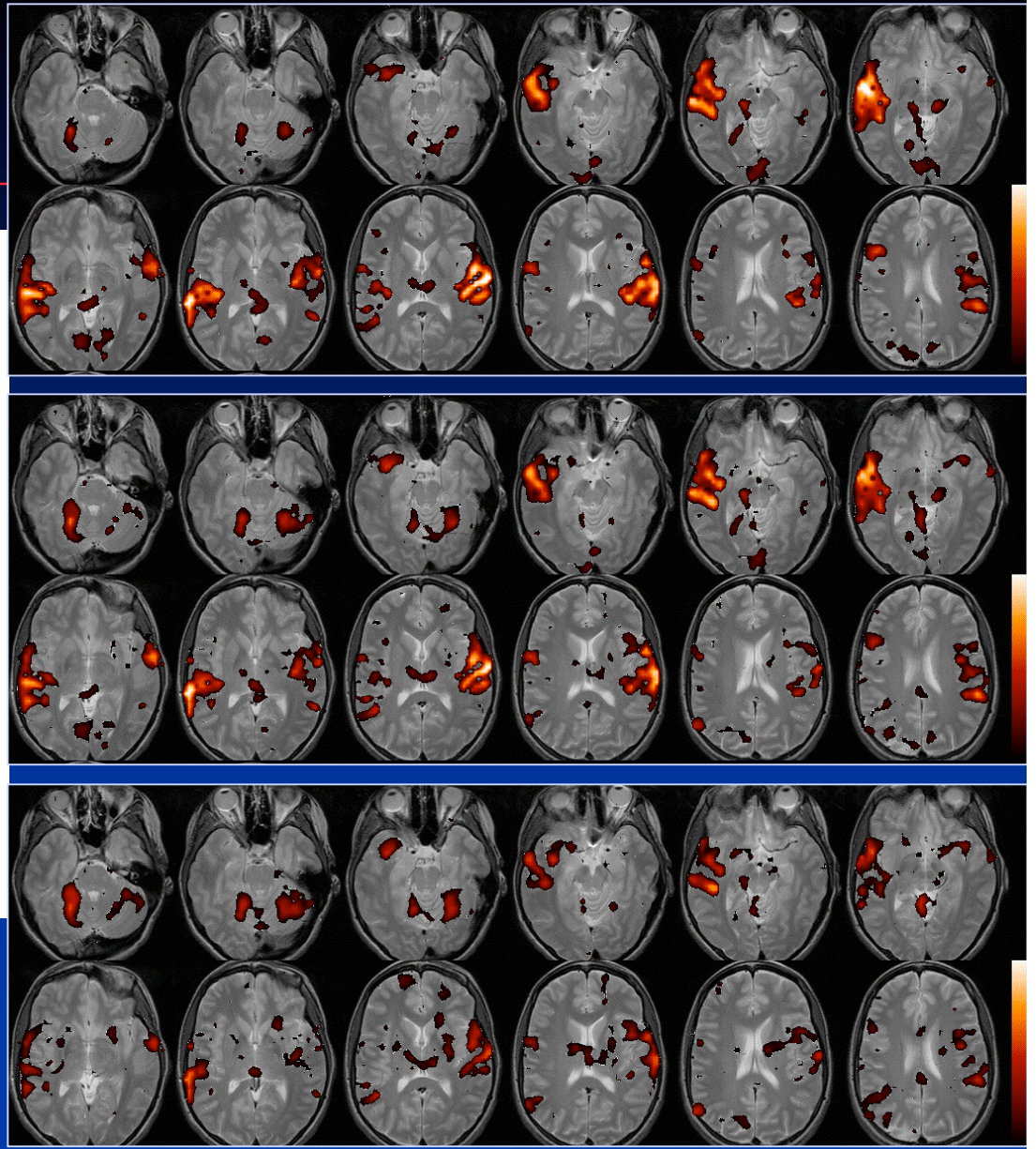
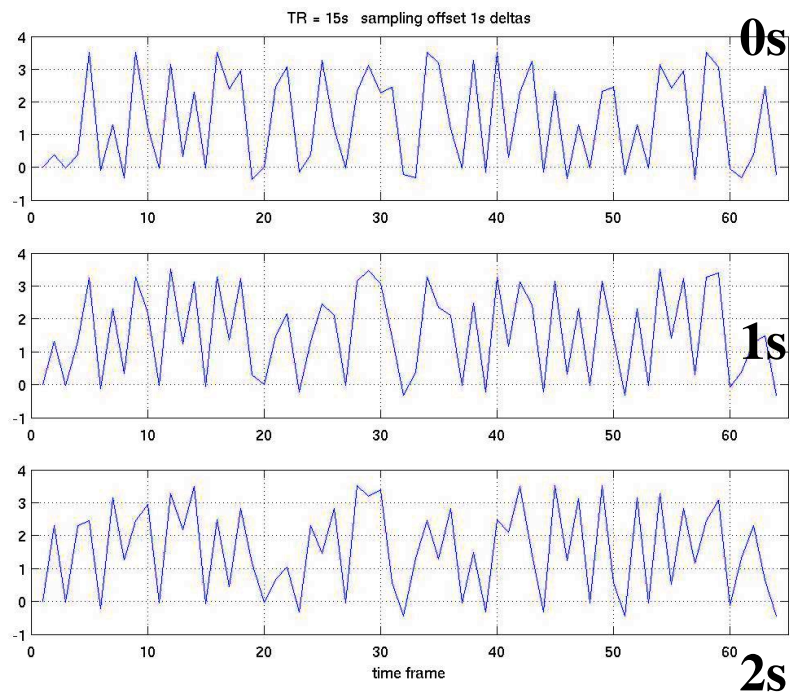


Miezen, et al. (2000)



M. Thomason

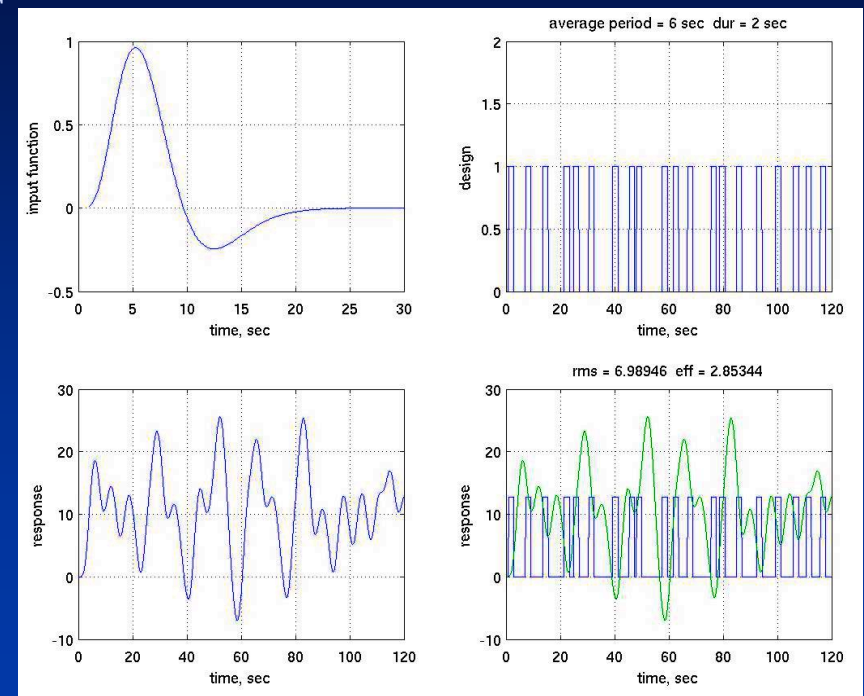
# Timing error



# Individual differences: HRF

- temporal differences in HRF  
important in event-related designs

-> measure individual HRFs





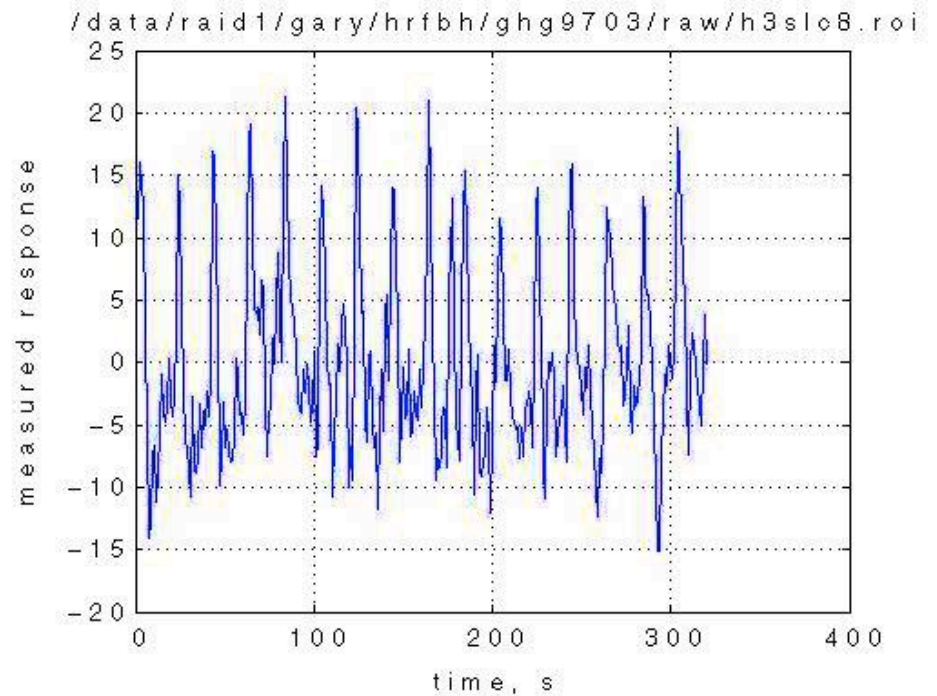
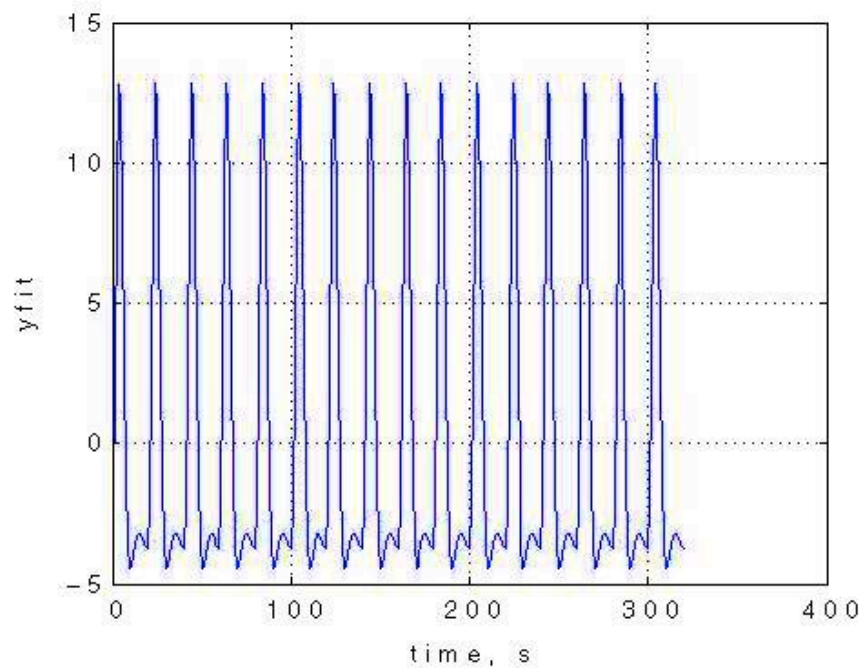
# Outline

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- Issues with fMRI reliability
- **Reducing confounds**
  - **HRF**
  - calibration of vasoreactivity
  - latency
- Physiological noise
- Multicenter studies

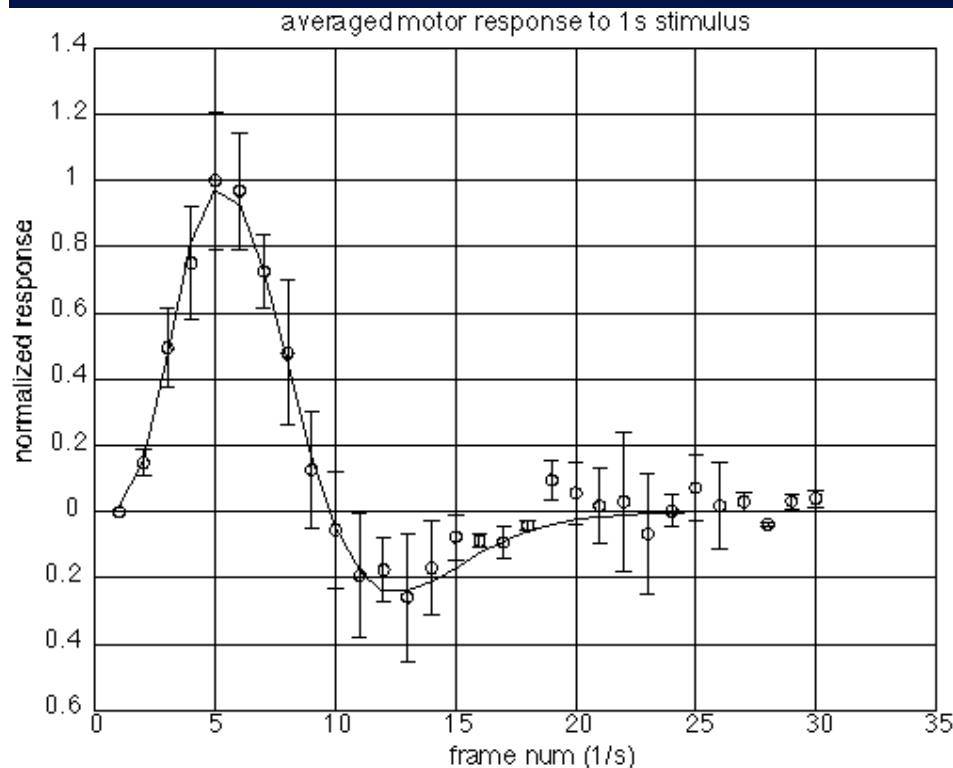
# Measurement of HRF

Use short stimulus, long ISI:

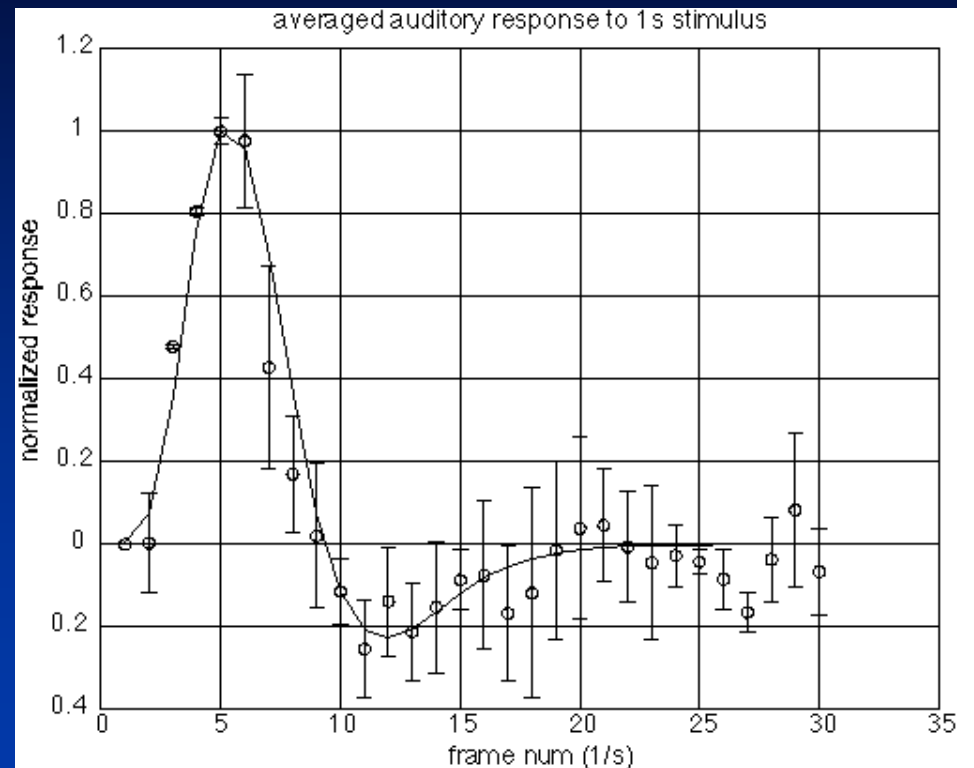


# HRF: Measure $h(t)$ with 1s task

motor



auditory



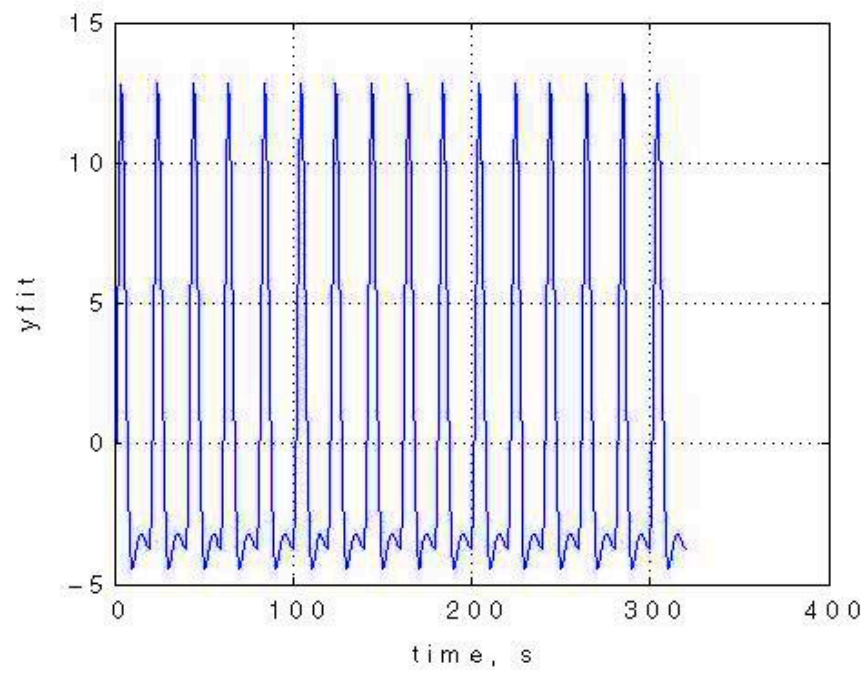
Finger tapping & tones at 3Hz, N=5

Glover, NI 1999

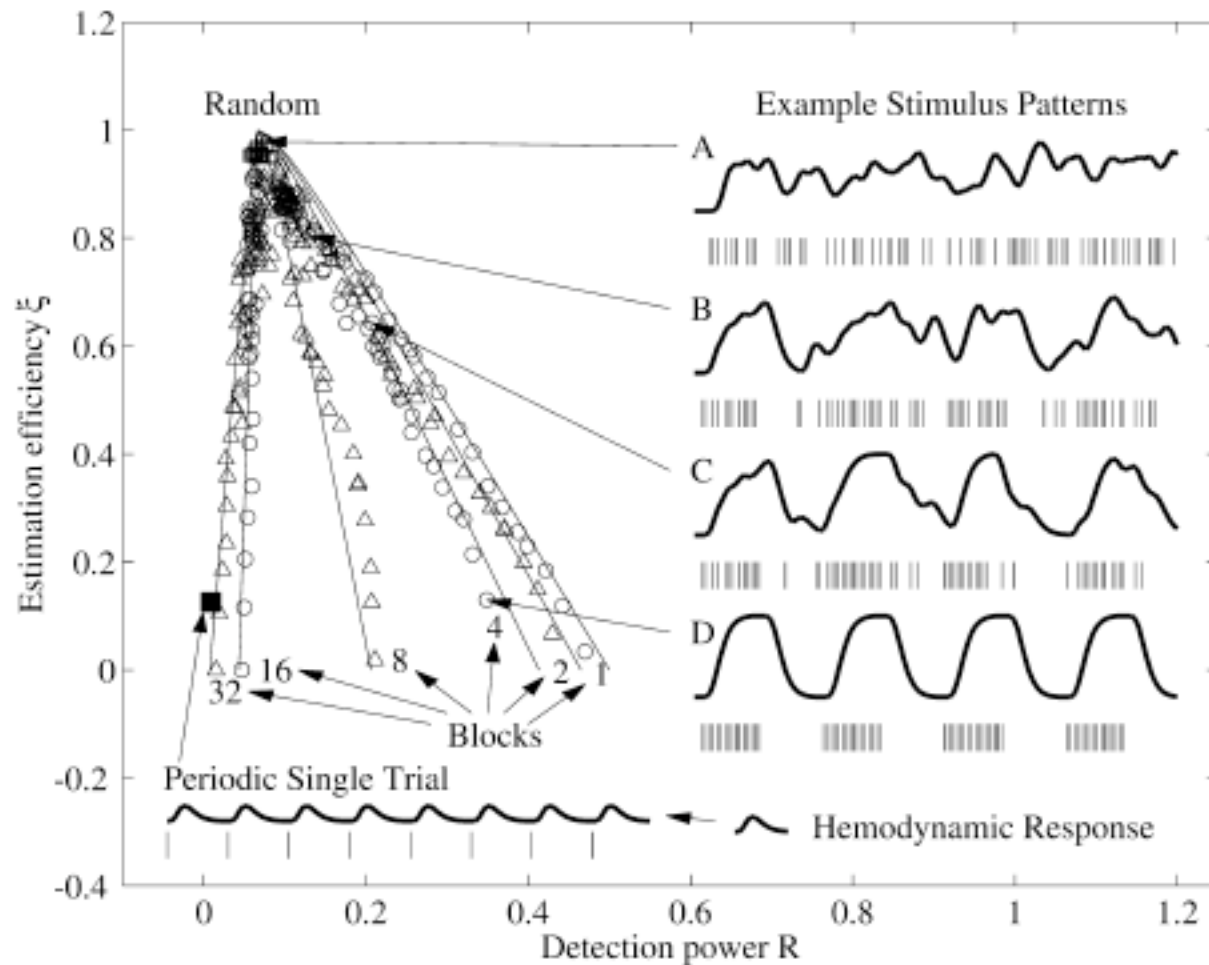
# Measurement of HRF

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- Event related designs are inefficient (T. Liu)



# Detection or Estimation?

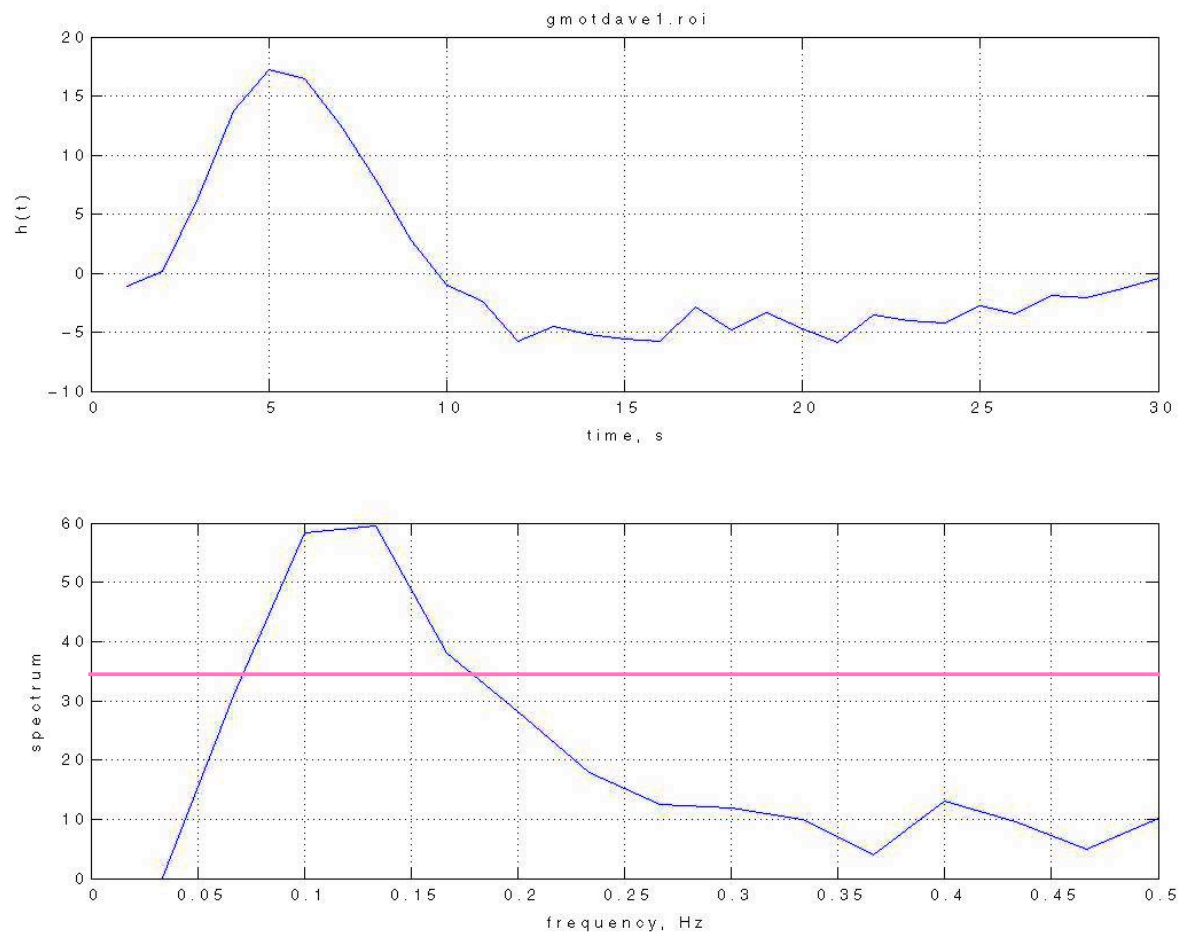


**Jittered (random) designs** → maximum estimation efficiency

**Block designs** → maximum detection power

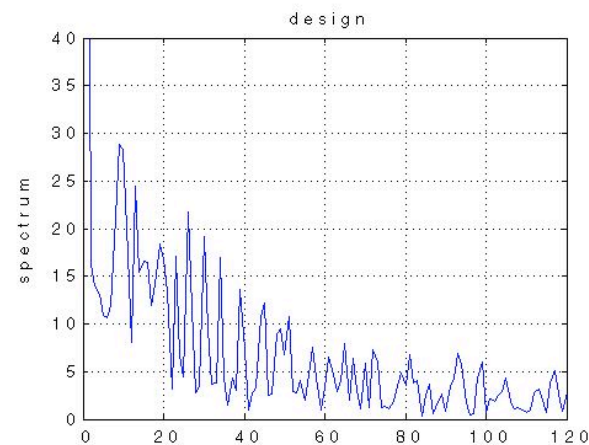
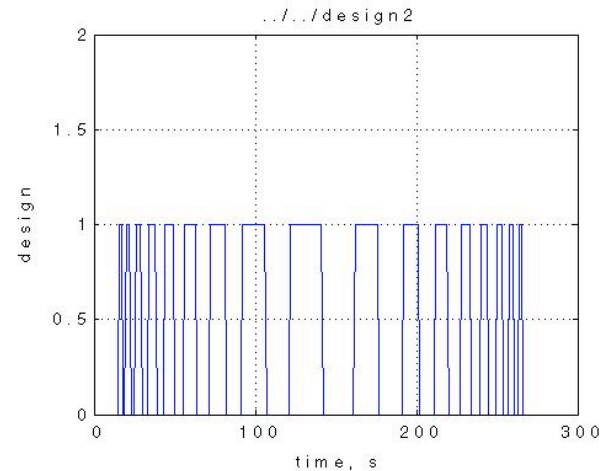
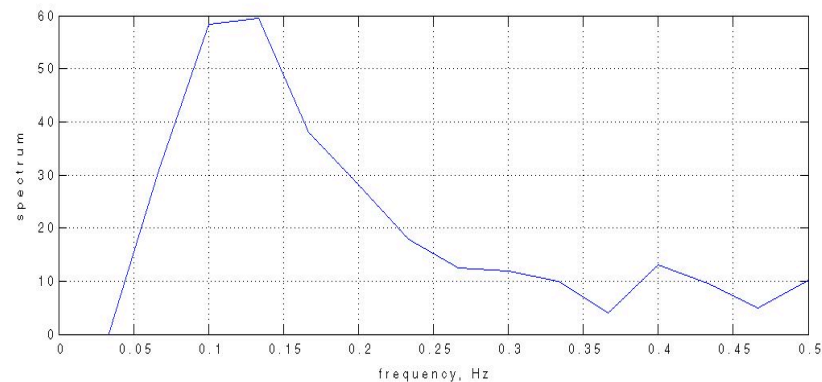
Liu et al. NI (2001)

# Spectral content of $h(t)$



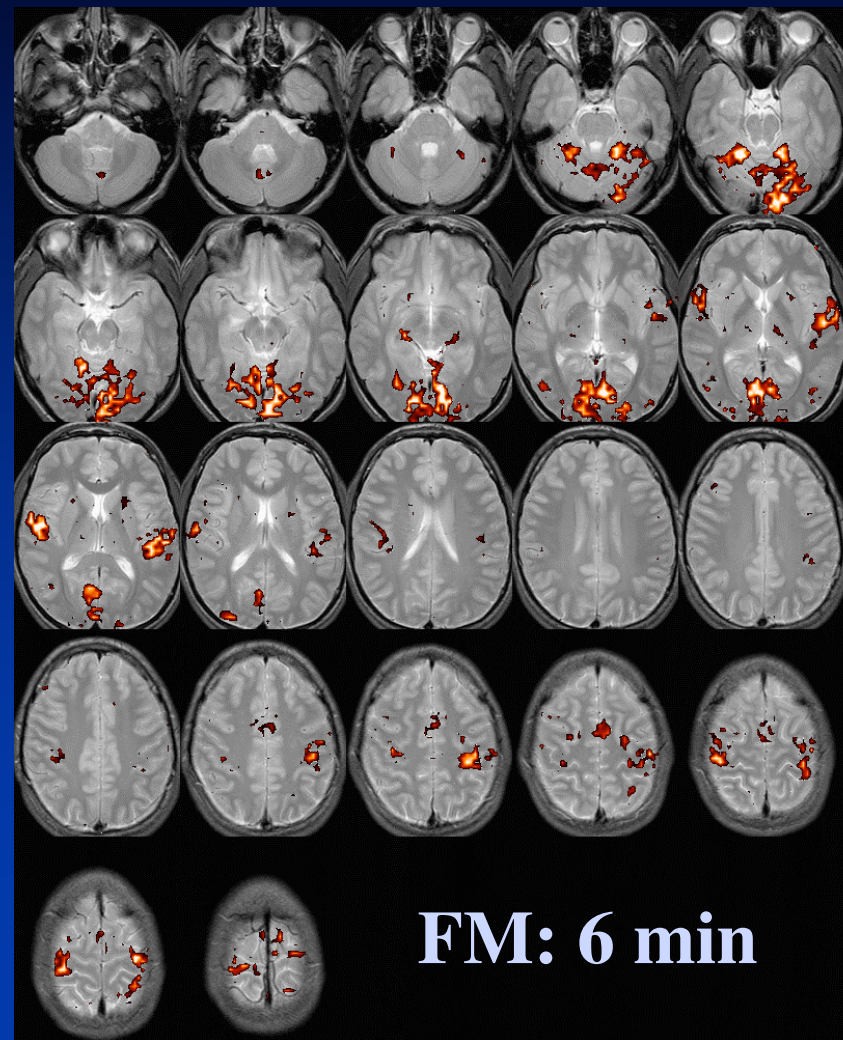
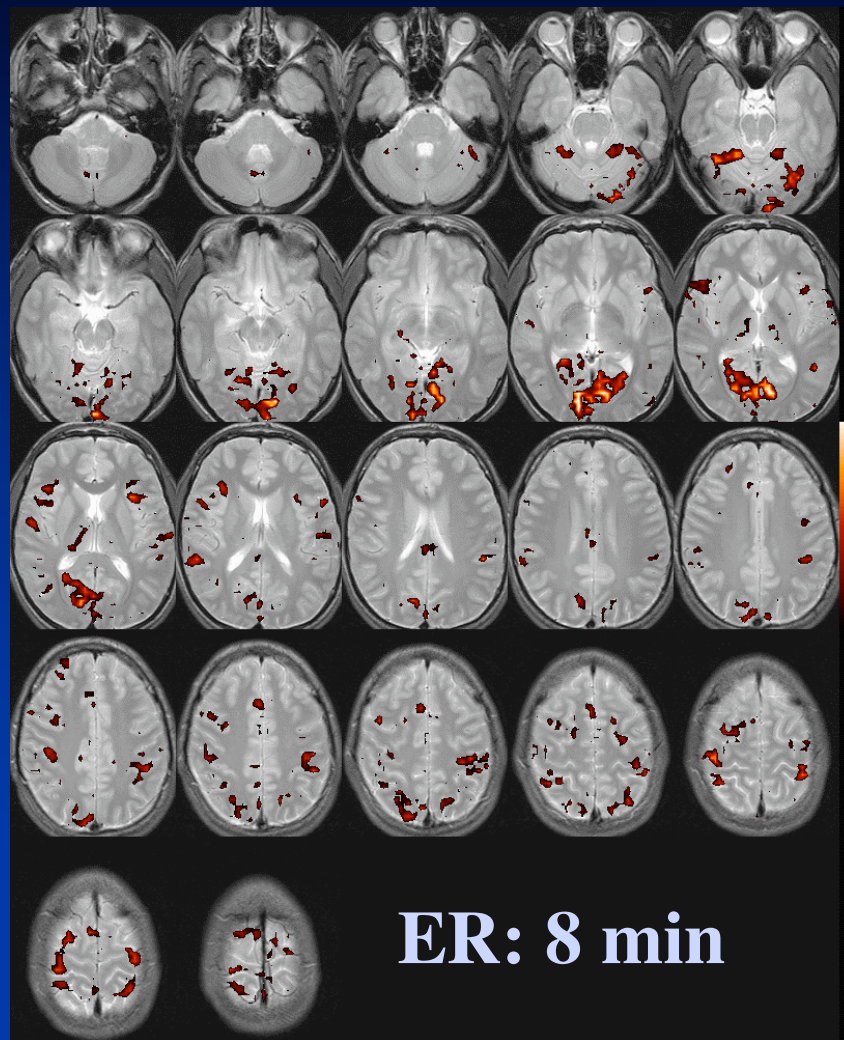
# Fourier Measurement of HRF: (FHRF)

Design has on/off blocks of duration 4s, 6s, 8s, 10s, 12s, 16s, 20s, 30s, 40s, ...4s





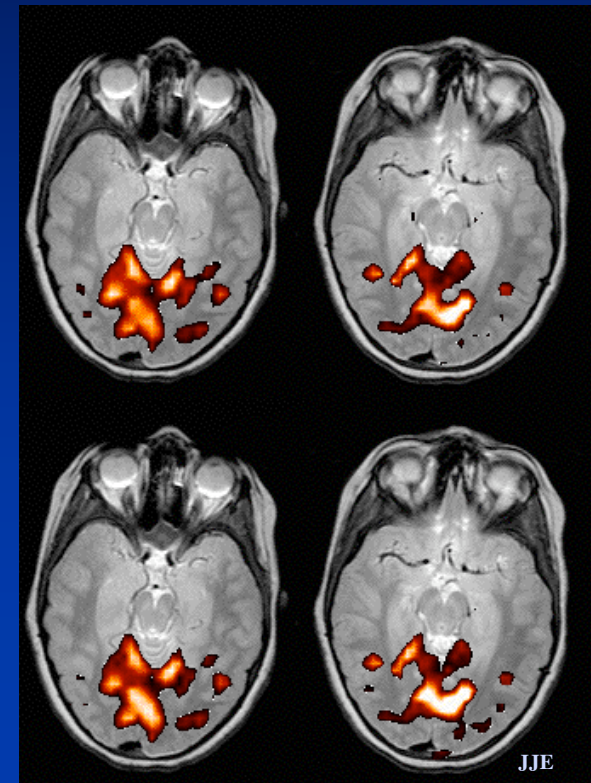
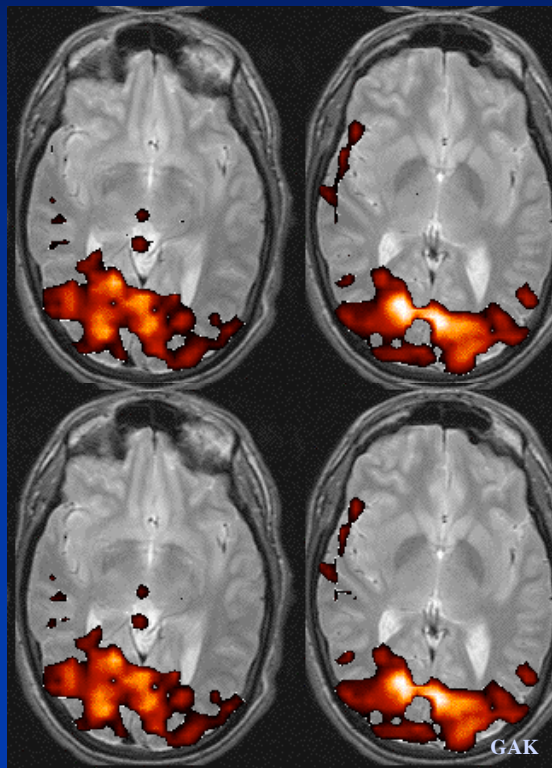
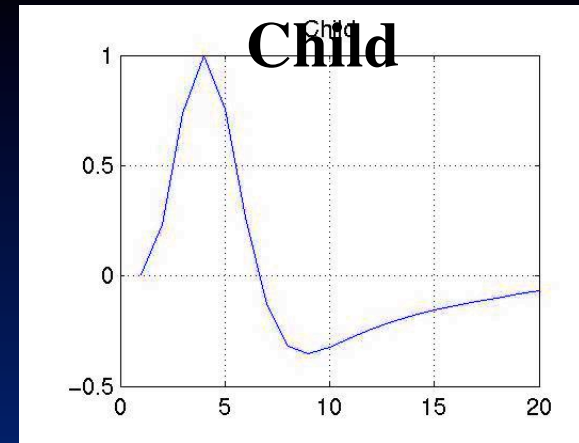
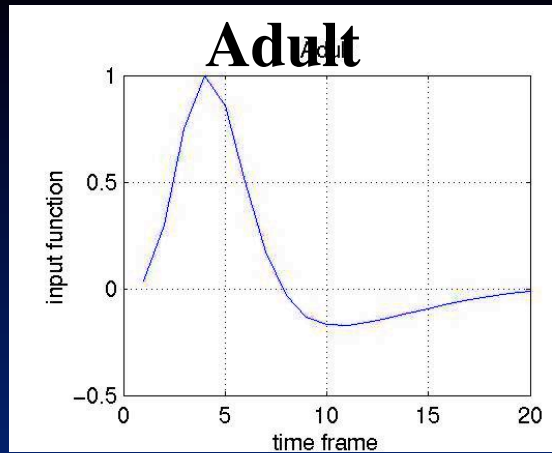
# Measurement Efficiency



# Effect of HRF on Activation

Canonical  
Gamma variate

Measured  
Linear HRF



## Measurement of HRF

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- Can provide characteristic info for each subject
  - requires a task
  - may be difficult to obtain in relevant regions
- Key features are amplitude & latency
  - may be obtained without invoking a task

# Outline

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- Issues with fMRI reliability
- Reducing confounds
  - HRF
  - **calibration of vasoreactivity**
  - latency
- Physiological noise
- Multicenter studies

# Vasoreactivity

→ rCBF  
[Hb]

↓ OEF

$$CMRO2 = OEF \times rCBF \times [Hb]$$

↓  
[Hb] →

$$\Delta R2^* \propto rCBV_a [Hb]_a^\beta - rCBV_0 [Hb]_0^\beta$$

$$BOLD \propto -TE \cdot \Delta R2^*$$

$$rCBV \propto rCBF^\alpha$$

$$BOLD_a = M \left[ f^\alpha \left( \frac{m}{f} \right)^\beta - 1 \right]$$

$$m \equiv CMRO2_a / CMRO2_0$$

$$f = rCBF_a / rCBF_0$$

*M* represents a 'gain' factor  
related to vascular reactivity

Davis, PNAS (1998)

Buxton, 2003



# Measuring vasoreactivity

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Use a task that does not involve change in metabolism:

- Hypercapnia
  - O<sub>2</sub> or CO<sub>2</sub>
  - Breath holding

$$\Delta R2^* \propto rCBV_a [Hb]_a^\beta - rCBV_0 [Hb]_0^\beta$$

$$BOLD \propto -TE \cdot \Delta R2^*$$

$$rCBV \propto rCBF^\alpha$$

$$BOLD_a = M[f^\alpha (\frac{m}{f})^\beta - 1]$$

$$m \equiv CMRO2_a / CMRO2_0$$

$$f = rCBF_a / rCBF_0$$

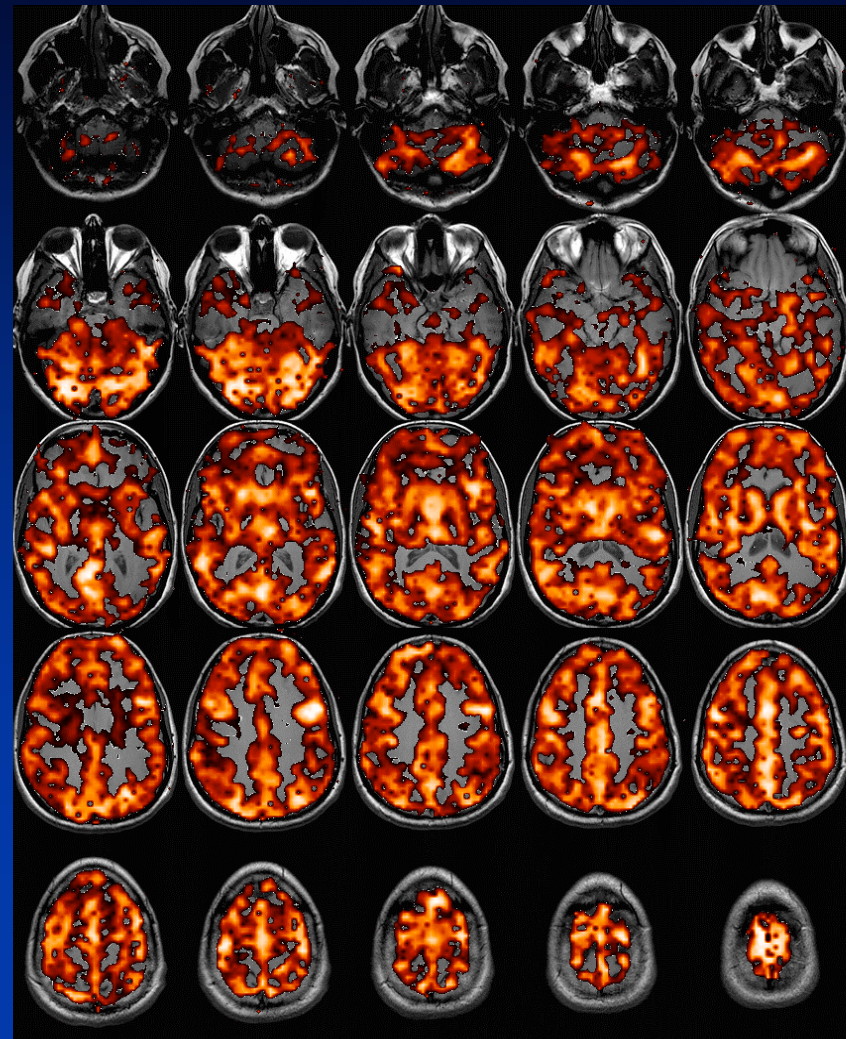
# BH Task

Block trial: 15s off/on  
8 cycles, 4 min, 15 s

breathe  
14s

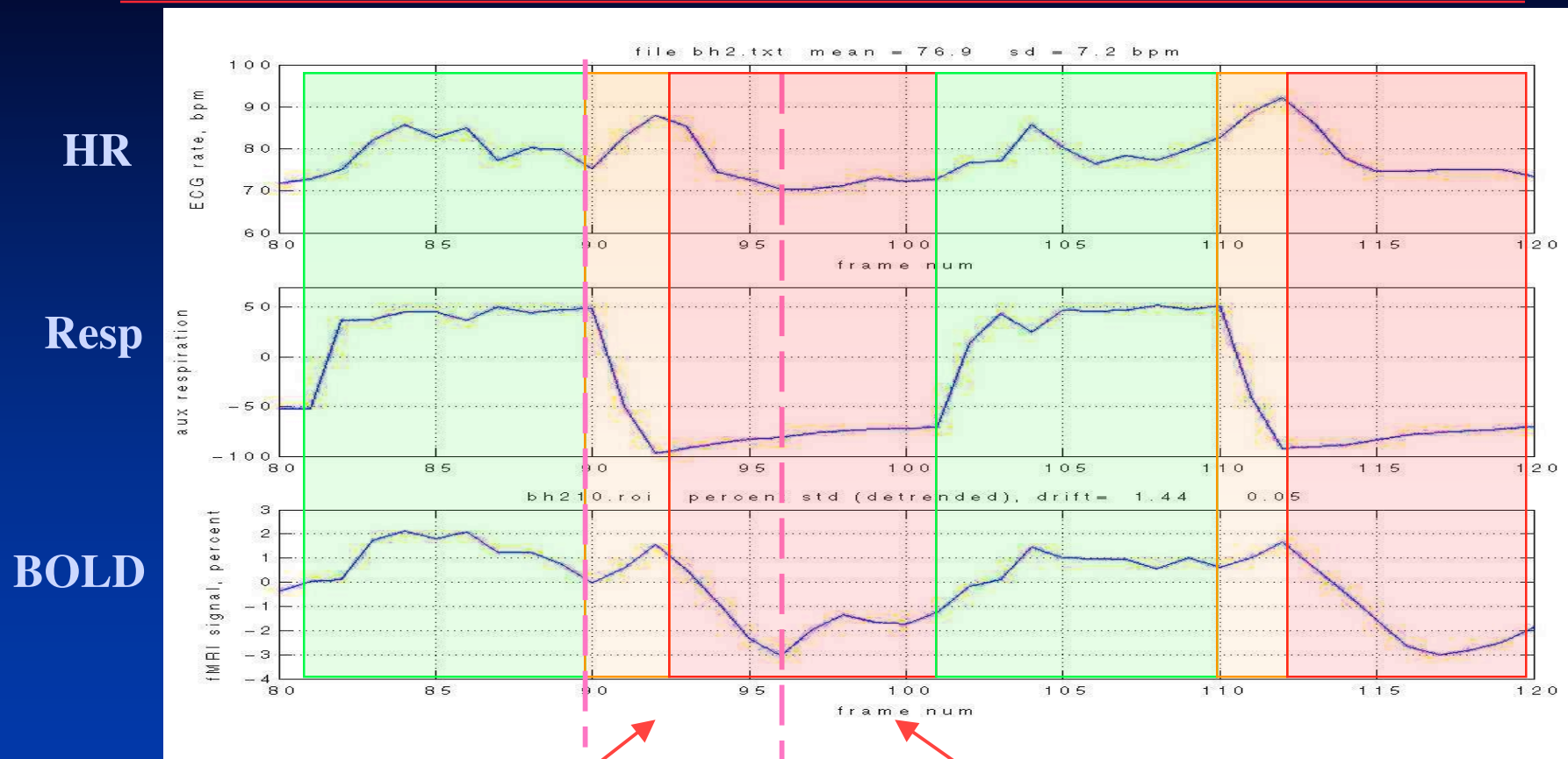
Breath in &  
hold 2s

Hold 14s





# BH-induced BOLD signal

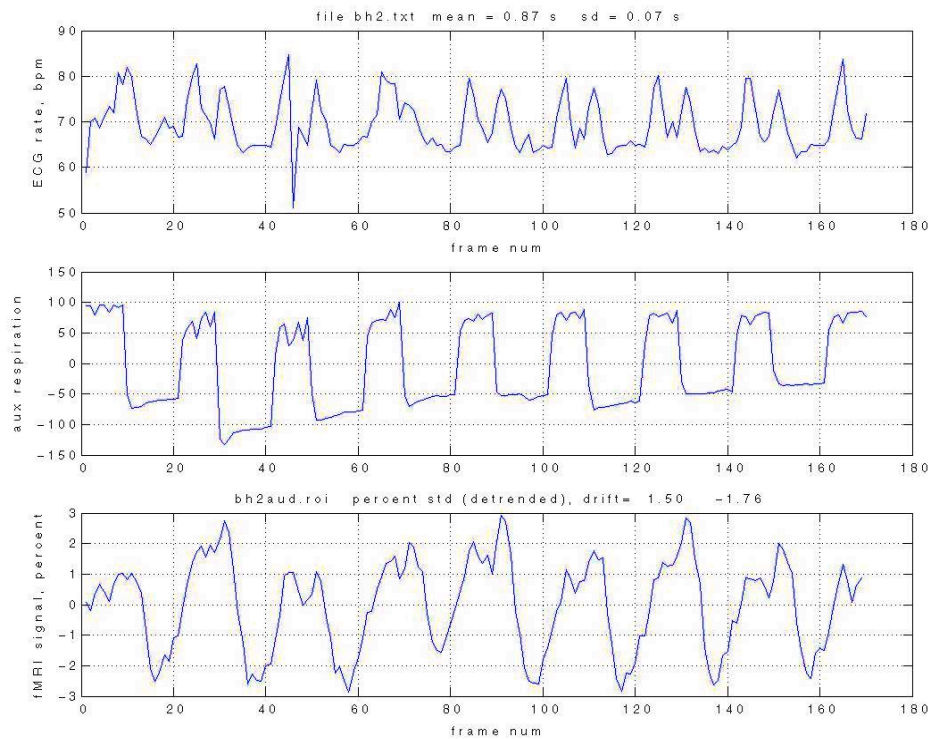
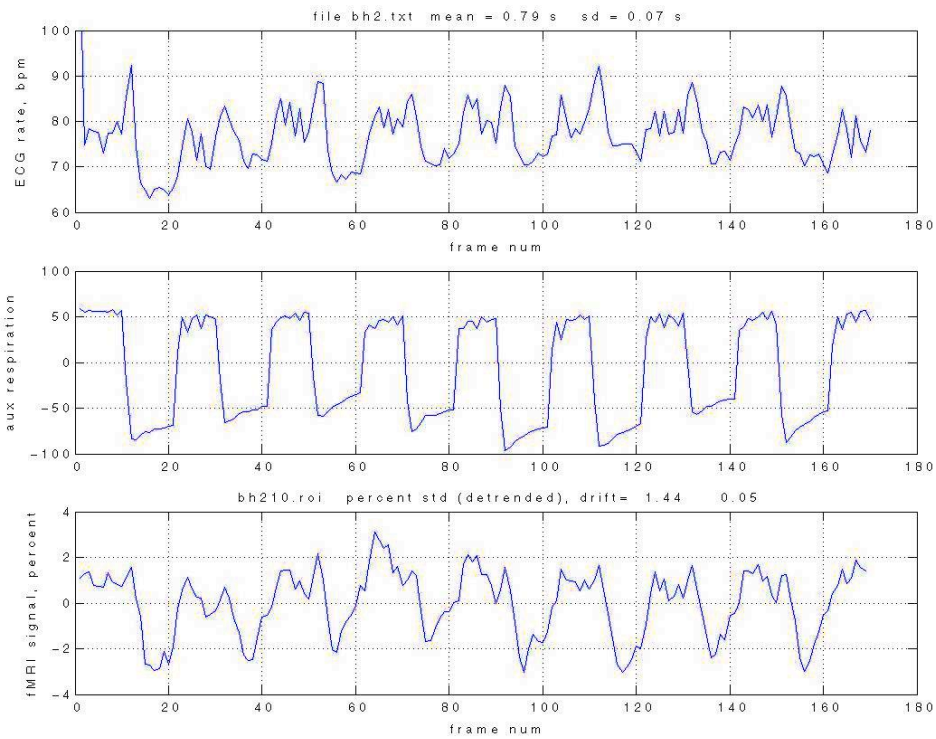


Thomason,  
et. al,  
2007

Vascular res.  $\downarrow \Rightarrow$  HR  $\downarrow \Rightarrow$   
 $\downarrow$  CBF  $\Rightarrow$  hypoxia

Basal metab.  $\Rightarrow$  O<sub>2</sub>  $\downarrow$ , CO<sub>2</sub>, NO, H<sup>+</sup>  $\uparrow$   
 $\Rightarrow$  vasodilation  $\Rightarrow$   $\uparrow$  rCBF

# Vascular Responsivity: BH



# BOLD Signal

→ rCBF  
[Hb]

↓ OEF

CMRO2 = OEF x rCBF x [Hb]

↓  
[Hb] →

$$\Delta R2^* \propto rCBV_a [Hb]_a^\beta - rCBV_0 [Hb]_0^\beta$$

$$BOLD \propto -TE \cdot \Delta R2^*$$

$$rCBV \propto rCBF^\alpha$$

$$BOLD_a = M[f^\alpha (\frac{m}{f})^\beta - 1]$$

$$m \equiv CMRO2_a / CMRO2_0$$

$$f = rCBF_a / rCBF_0$$

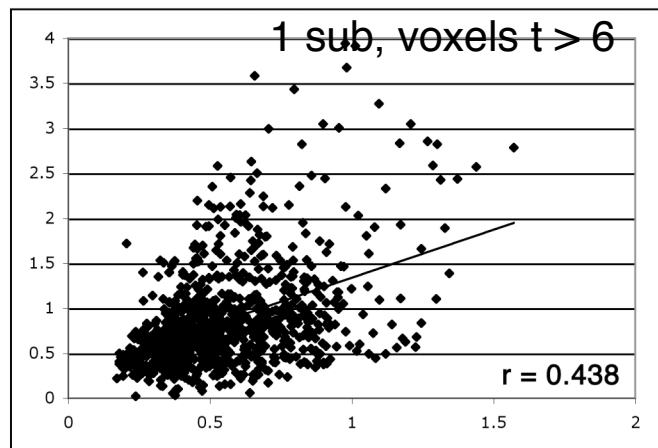
$$BOLD_{BH} = M[f_{BH}^{\alpha-\beta} - 1]$$

$$BOLD_a = BOLD_{BH} \frac{[f_a^\alpha (\frac{m}{f_a})^\beta - 1]}{[f_{BH}^{\alpha-\beta} - 1]}$$

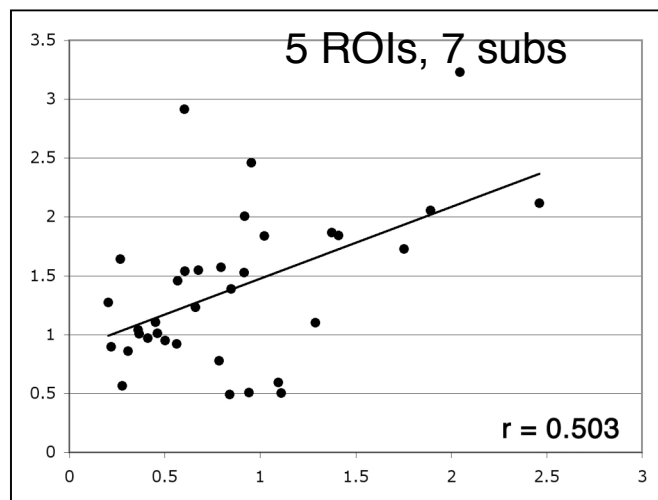
Davis, PNAS (1998)  
Buxton, 2003

Correlation between signal amplitude  
in BH and WM scans

A.



B.

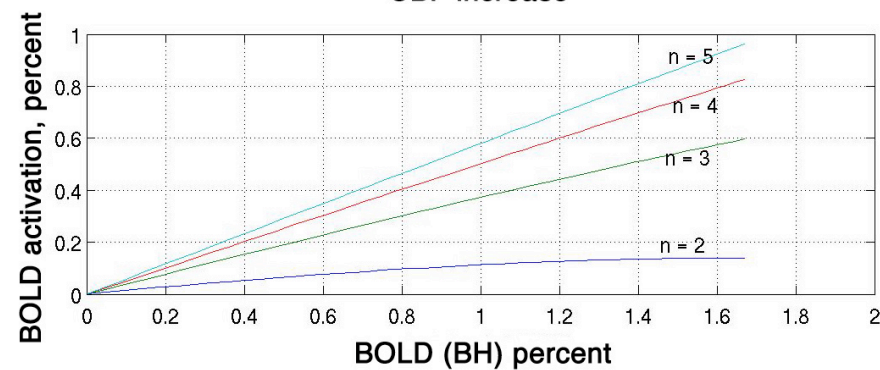
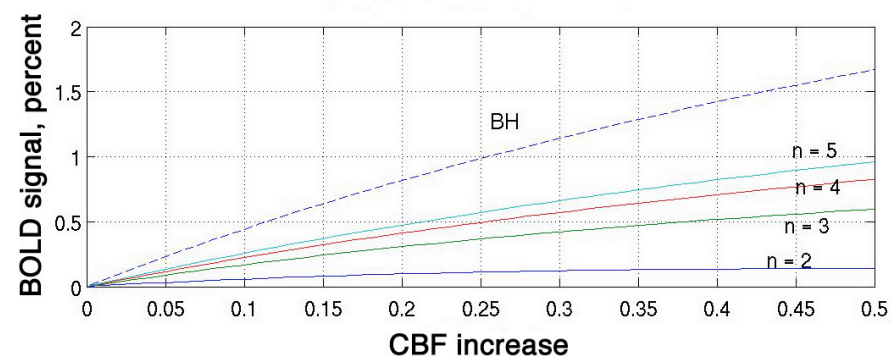


Working memory BOLD signal

# BH Calibration

A

$F(\text{BH}/\text{act}) = 1.15$



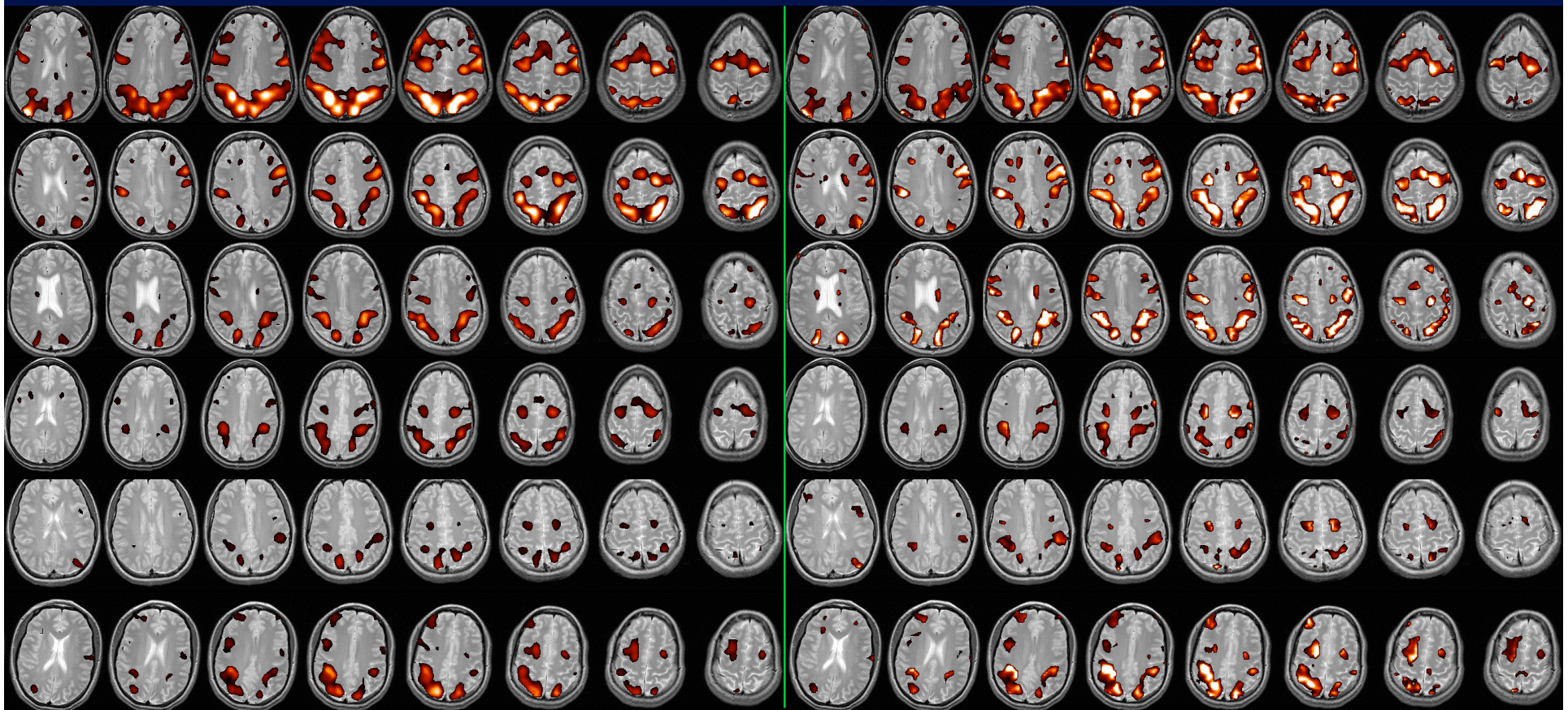
M. Thomason et al., 2007



# BH Calibration: Individual Subs

No calib

Calib



M. Thomason et al., 2007

$5 \leq t \leq 20$

# BH Calibration: Group Activation

No cal



Calib

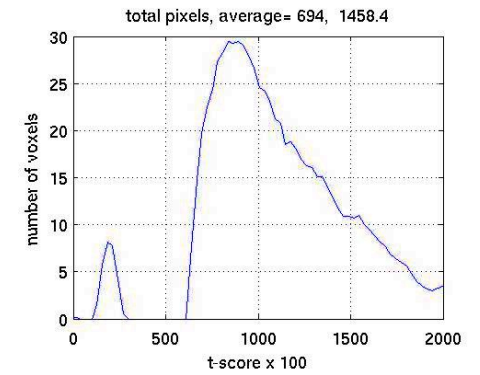
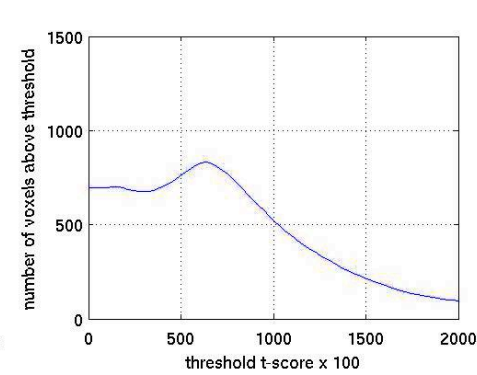
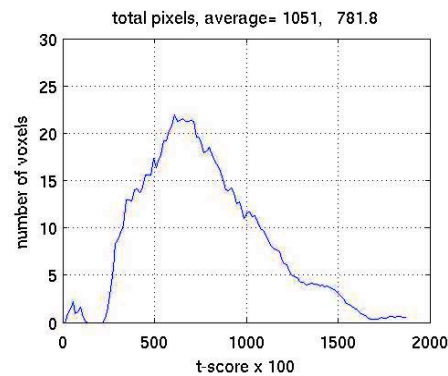
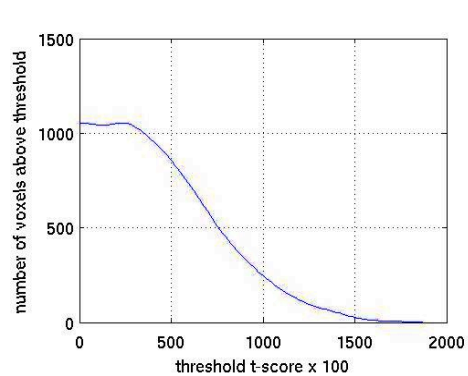
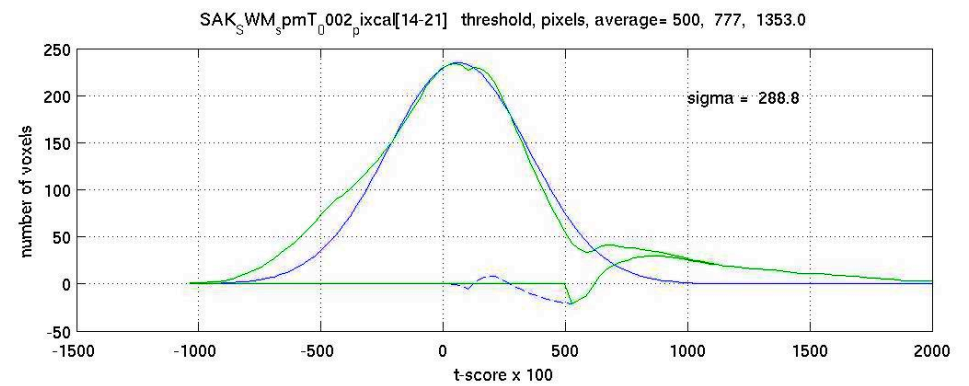
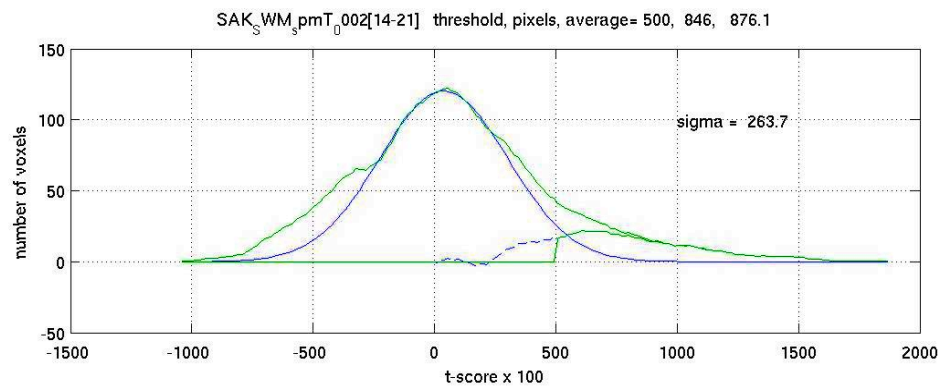


M. Thomason et al., 2007

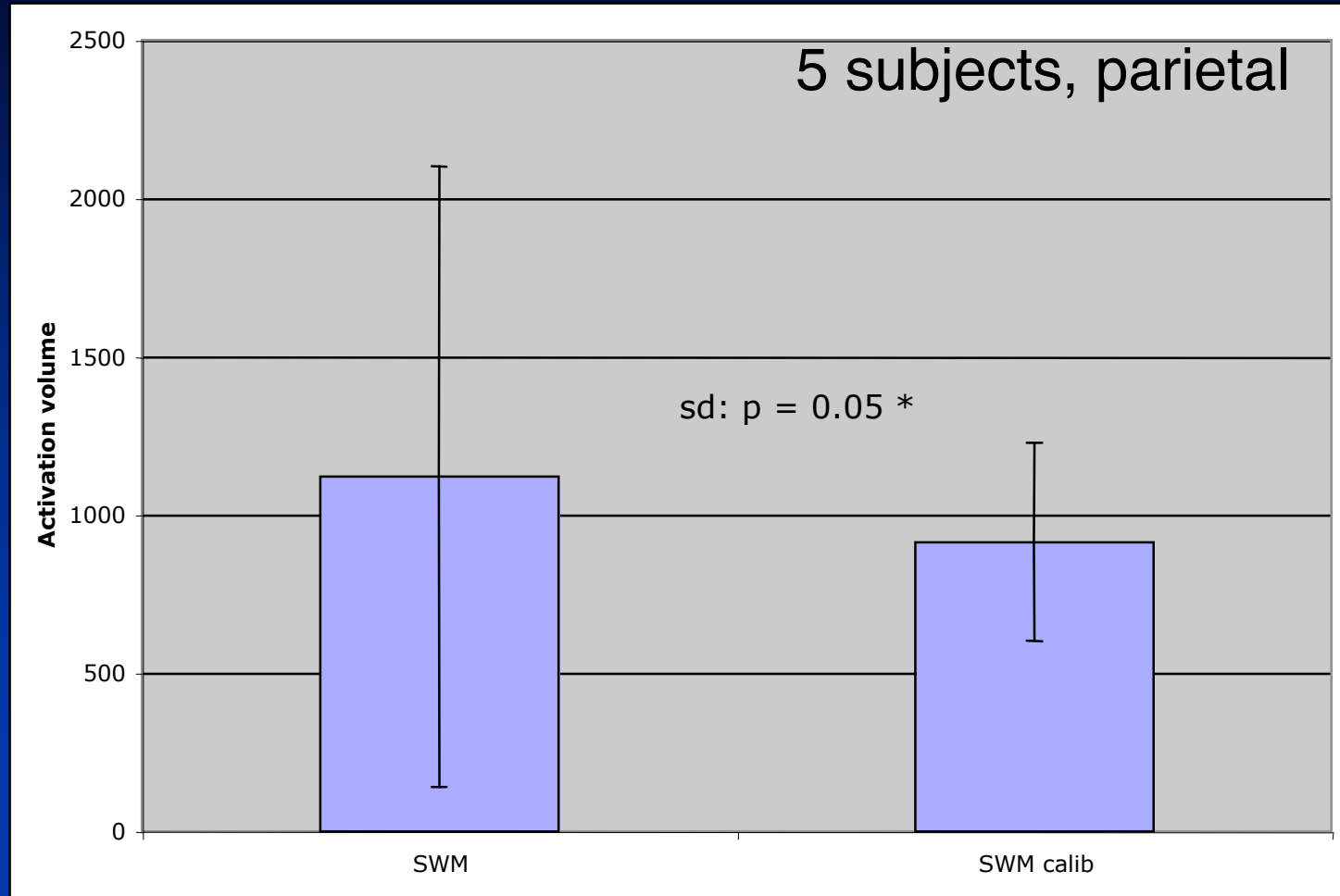
$3.5 \leq T \leq 10$



# Activation Response



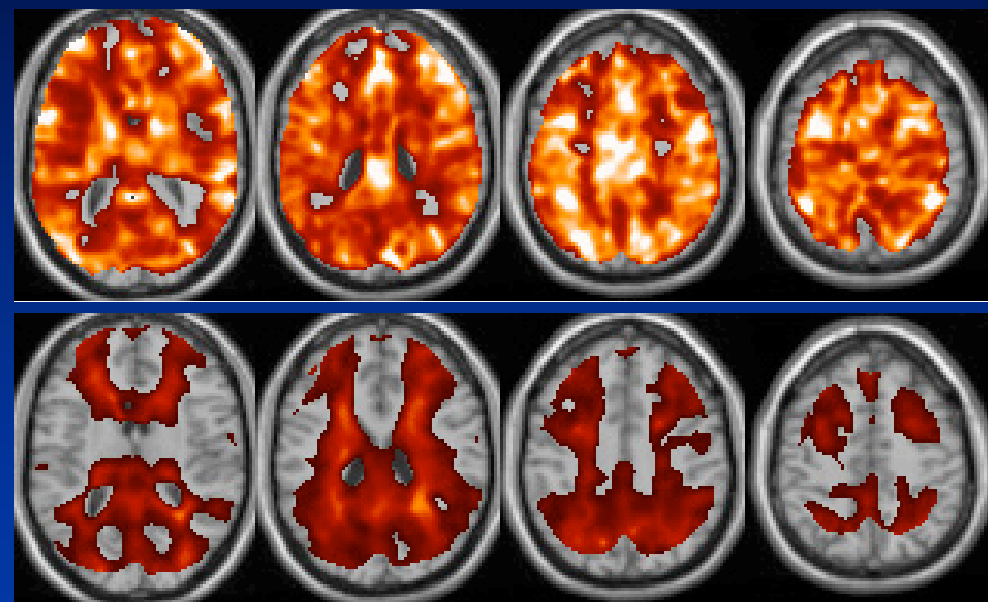
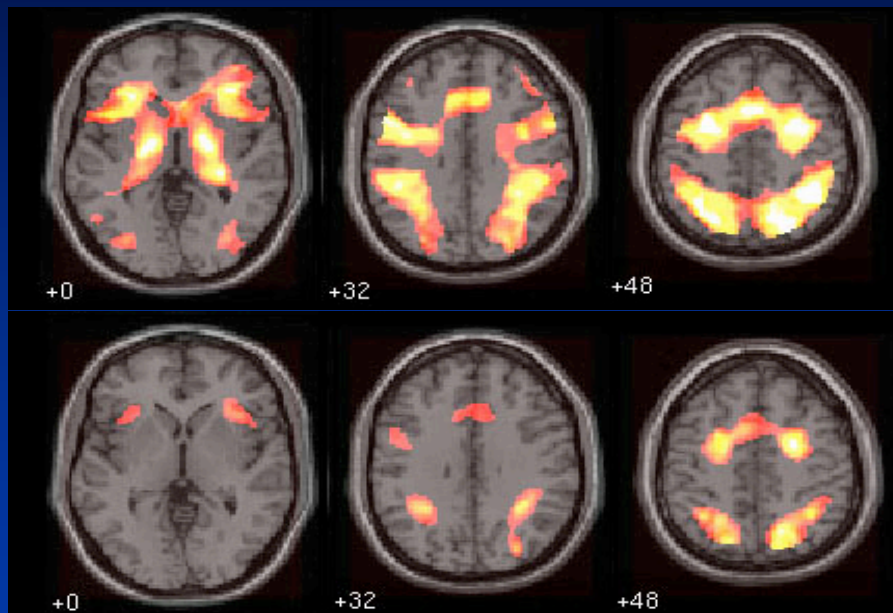
# Calibration: SWM



# Correlation: WM & BH

SWM

BH



Top: adults  
Bottom: children

Thomason, et. al, 2005

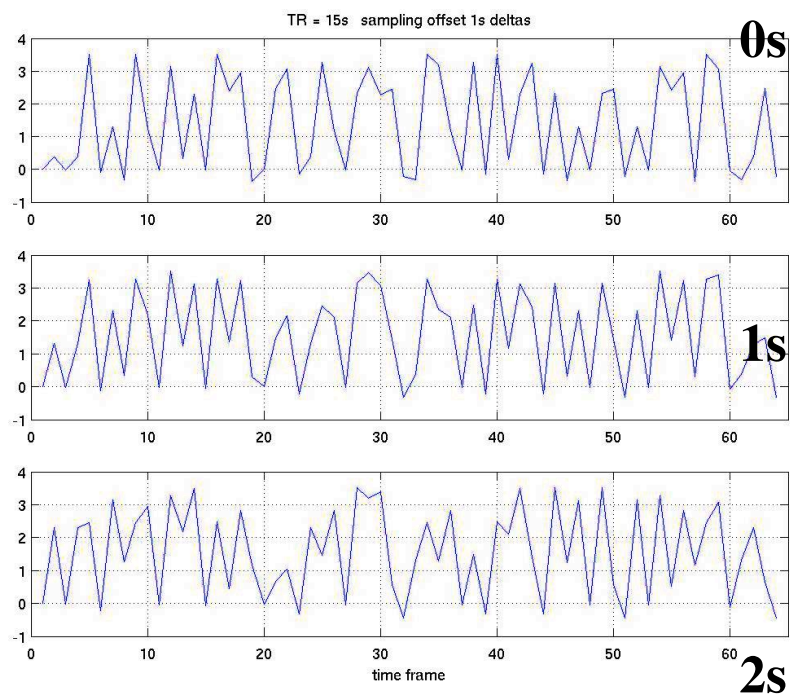
# Outline

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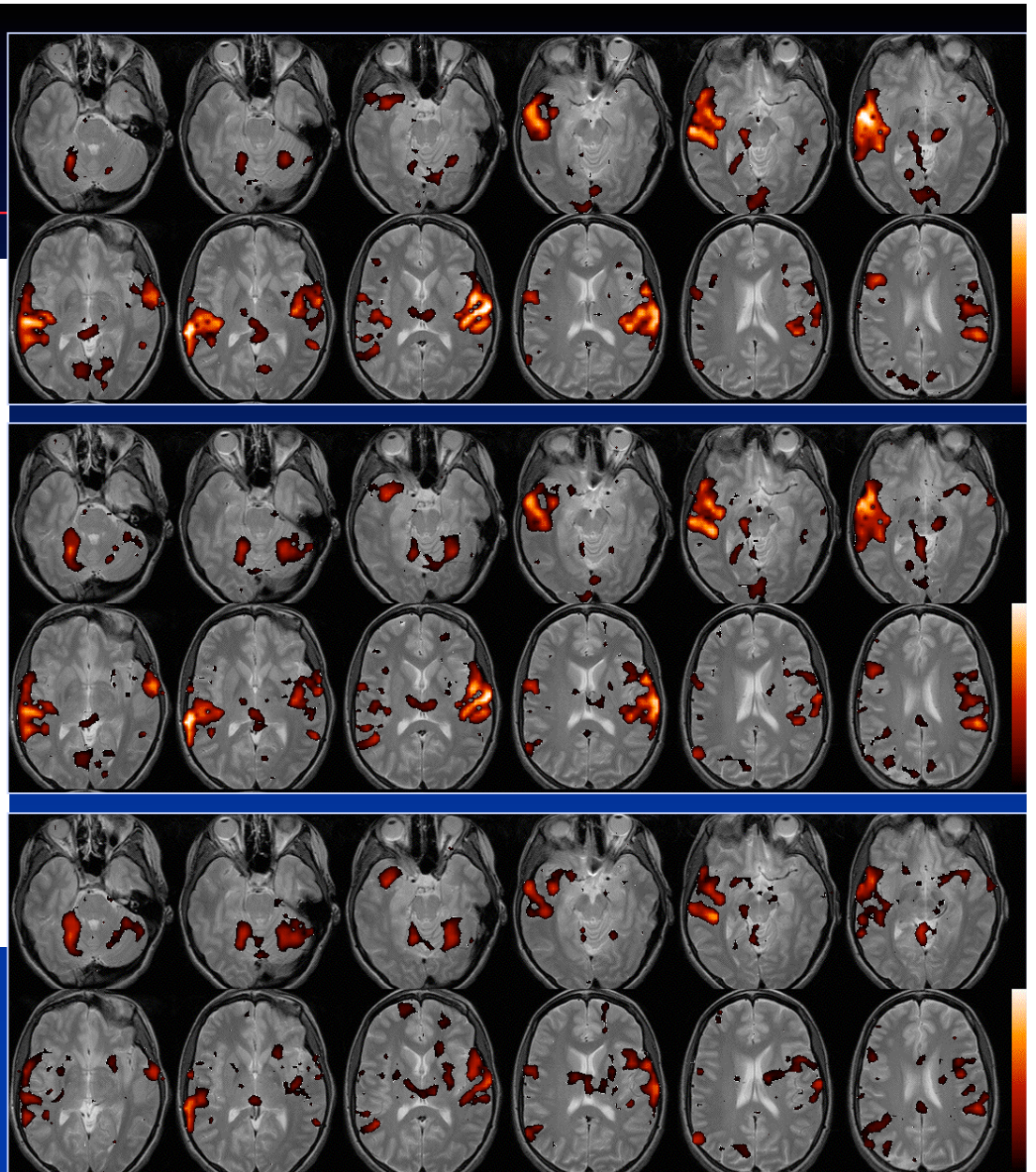
- Issues with fMRI reliability
- Reducing confounds
  - HRF
  - calibration of vasoreactivity
  - **latency**
- Physiological noise
- Multicenter studies



# Timing error



Auditory WM (N. Gaab)



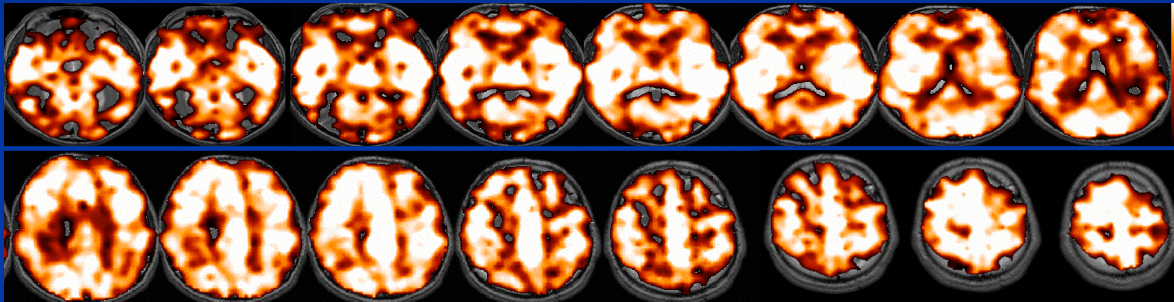
# BH to measure vascular latency

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Can a BH task be used to quantify relative differences in vascular latency across the brain?

BH causes activation “everywhere”

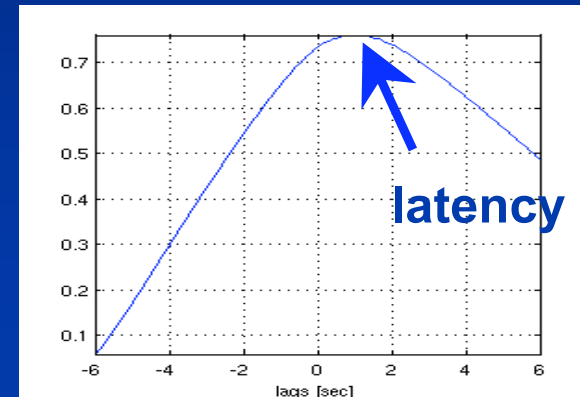
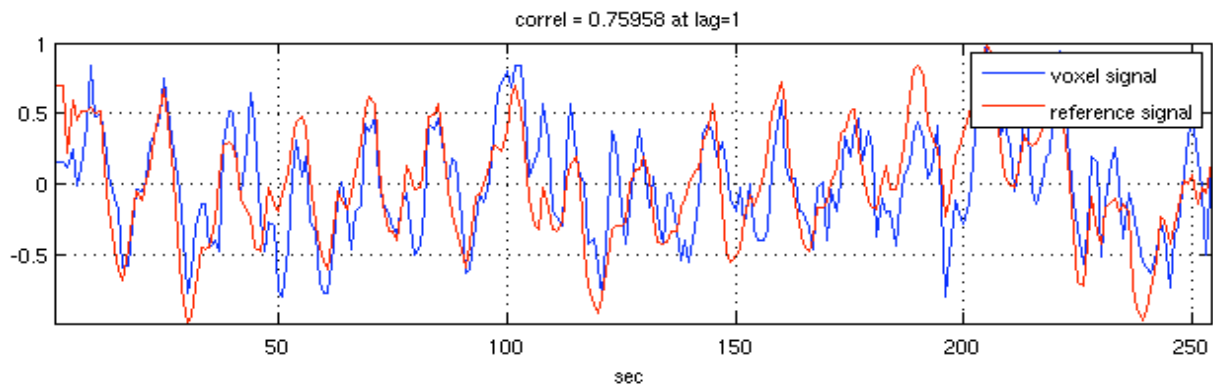
BH causes a BOLD signal response that is uncoupled from neural activation (CMRO<sub>2</sub>)



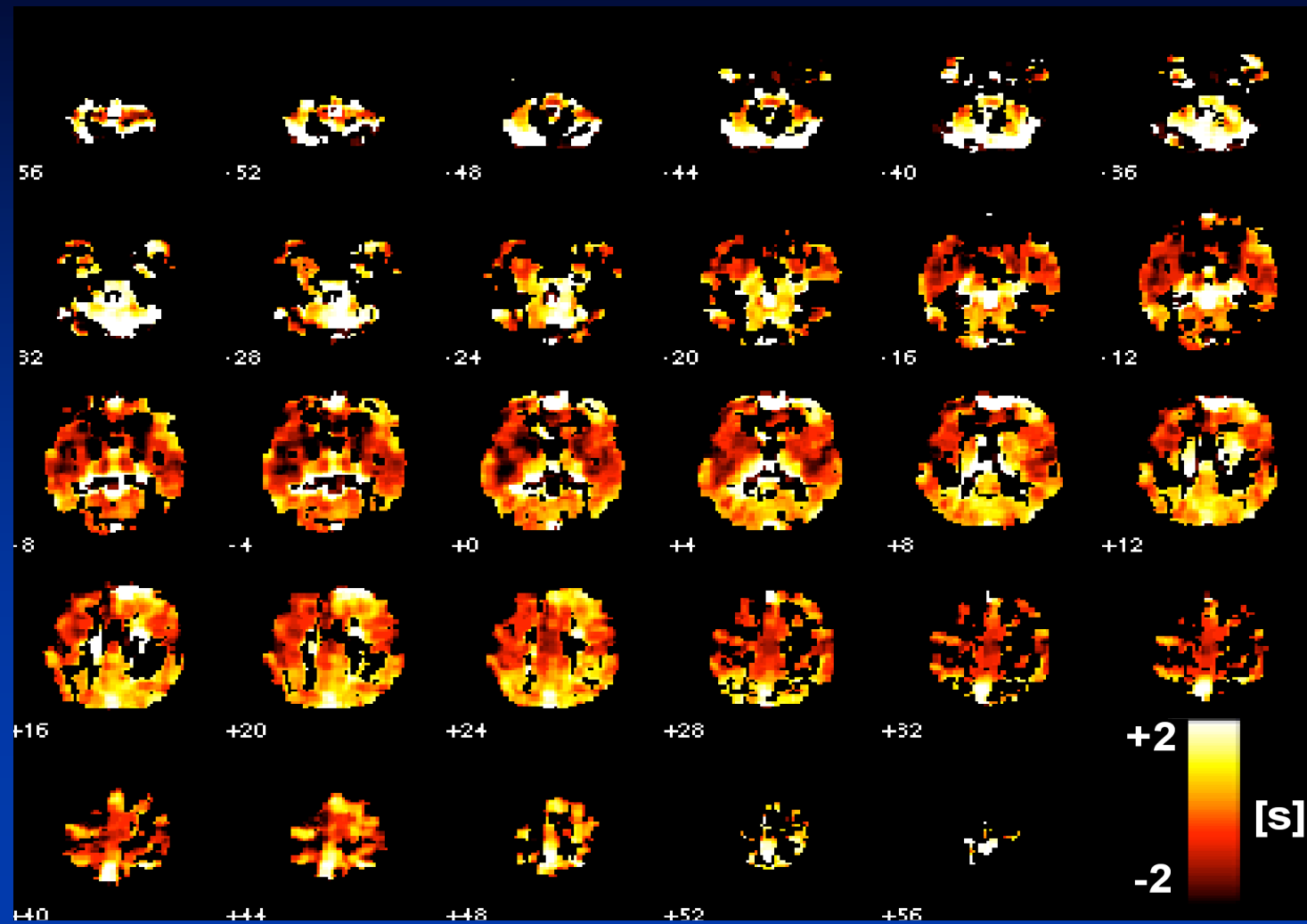
C. Chang (2008)



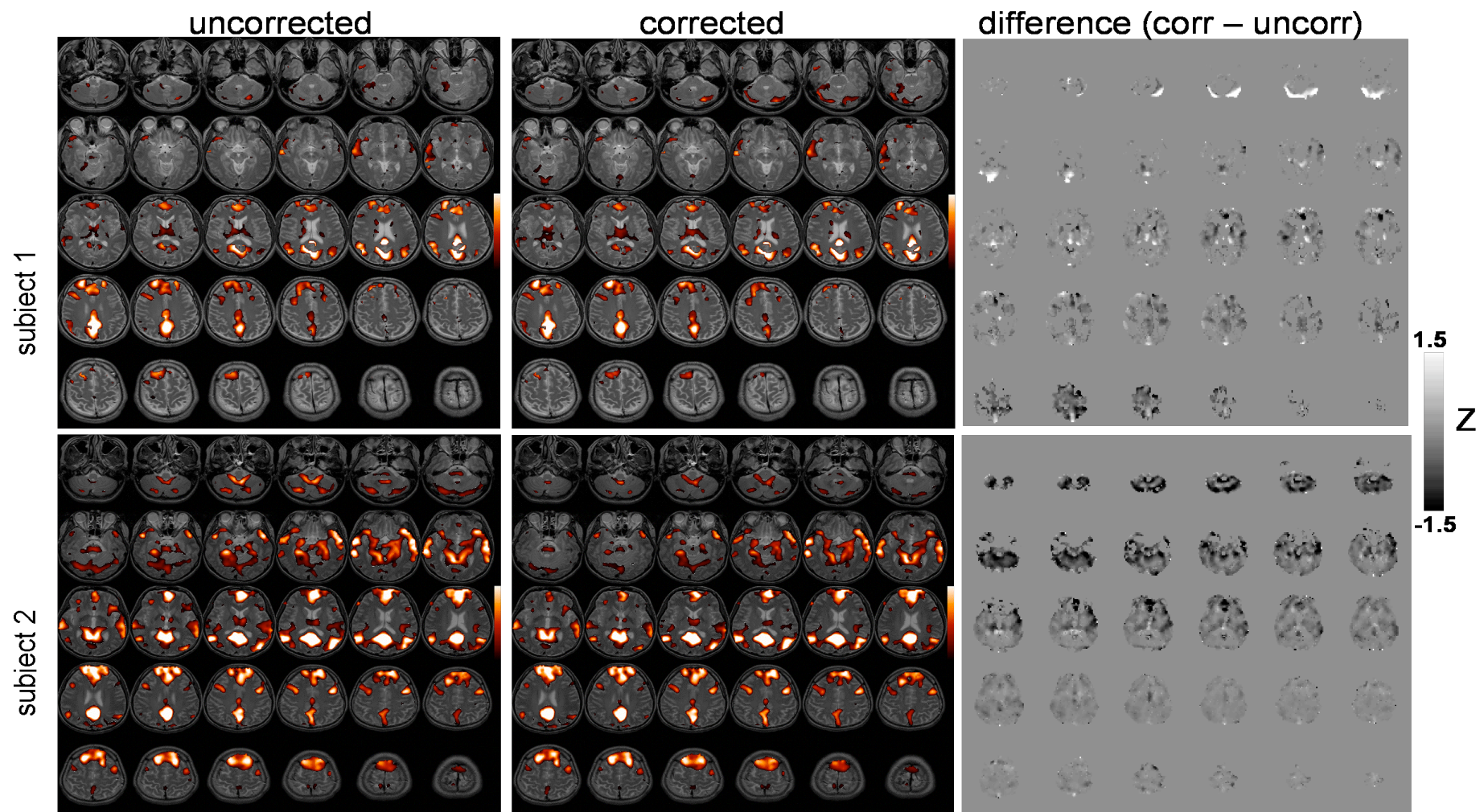
# Latency Measurement



# Latency Map

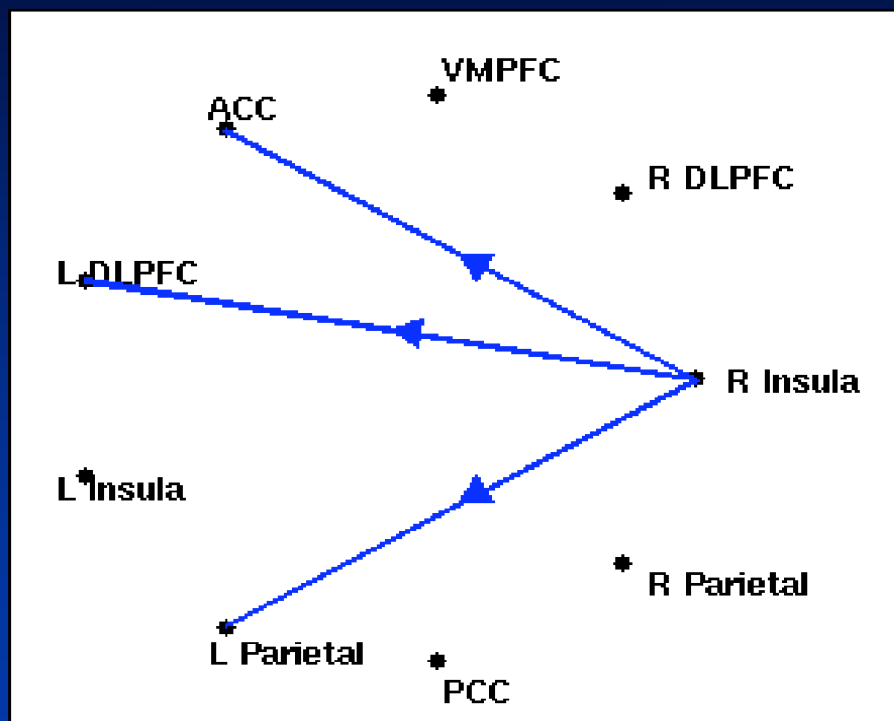


# Impact on default-mode network

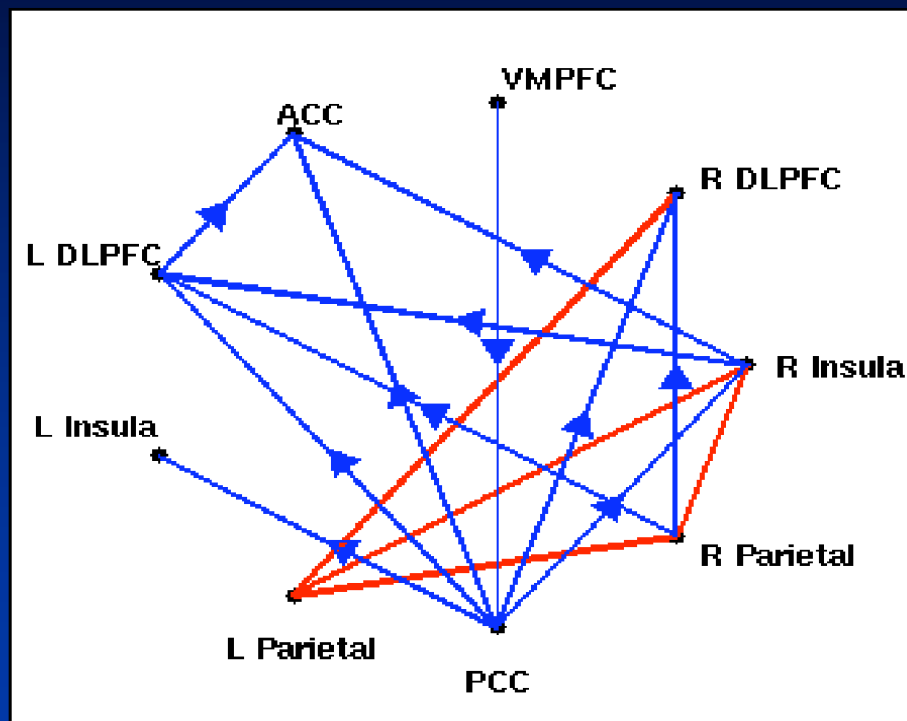


# Impact on Granger causality

Before correction



After correction



# Outline

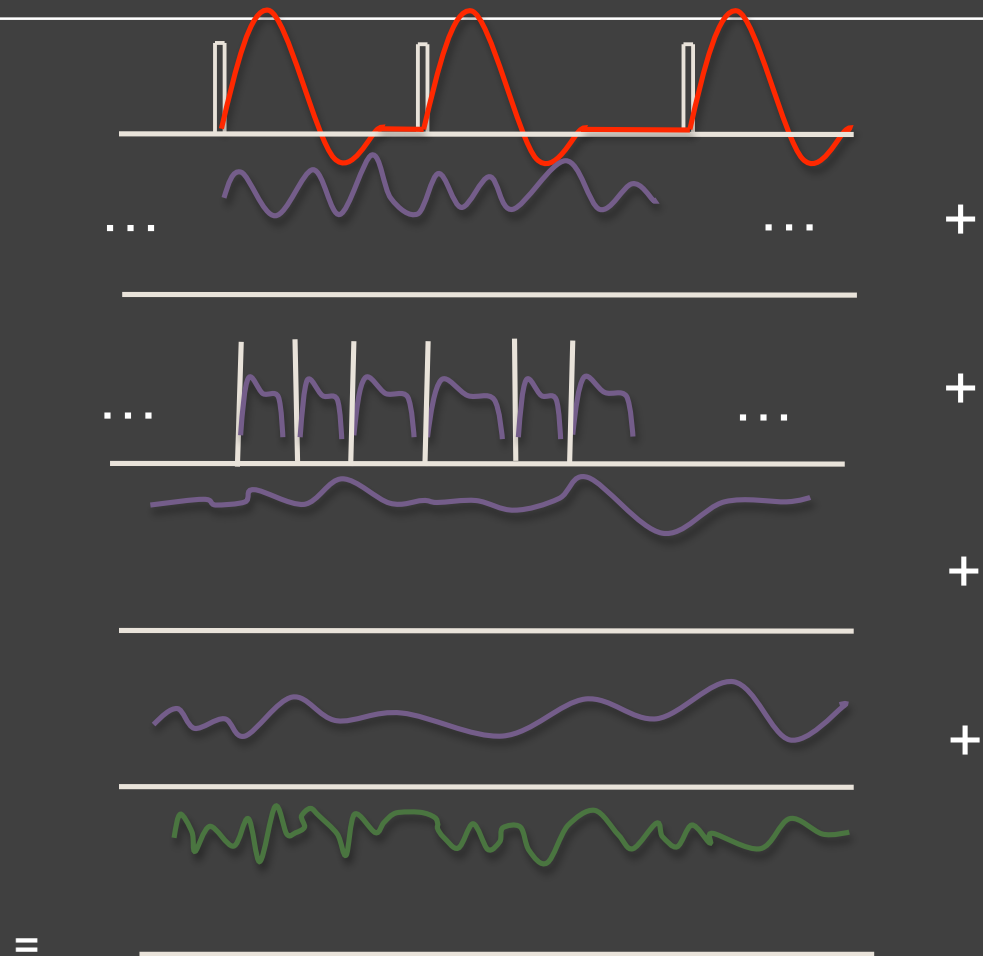
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- Issues with fMRI reliability
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  - calibration of vasoreactivity
  - latency
- **Physiological noise**
- Multicenter studies



# BOLD/Physio noise: sources

- Neuronal activation
- Respiration cycle
- Cardiac cycle
- Respiration volume ( $\approx \text{CO}_2$ )
- Heart rate



# Physio noise: reduction

---

- Neuronal activation

- Respiration cycle

- Cardiac cycle



RETROICOR

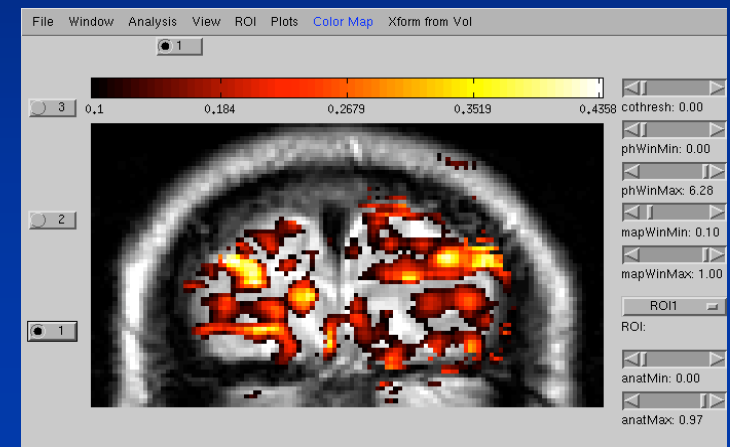
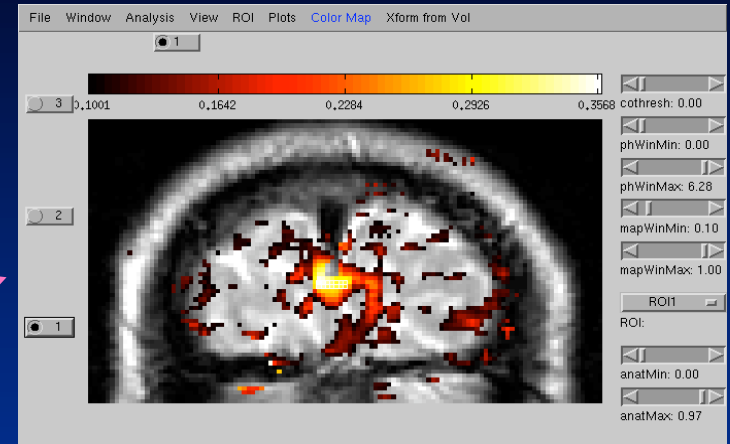
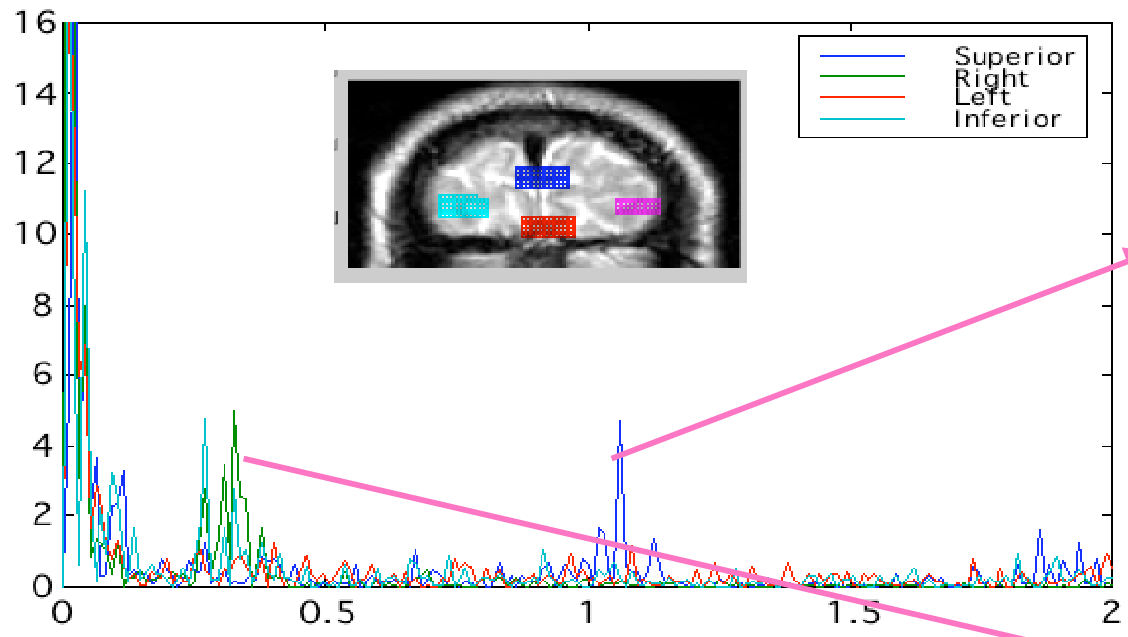
- Respiration volume ( $\approx \text{CO}_2$ )

- Heart rate



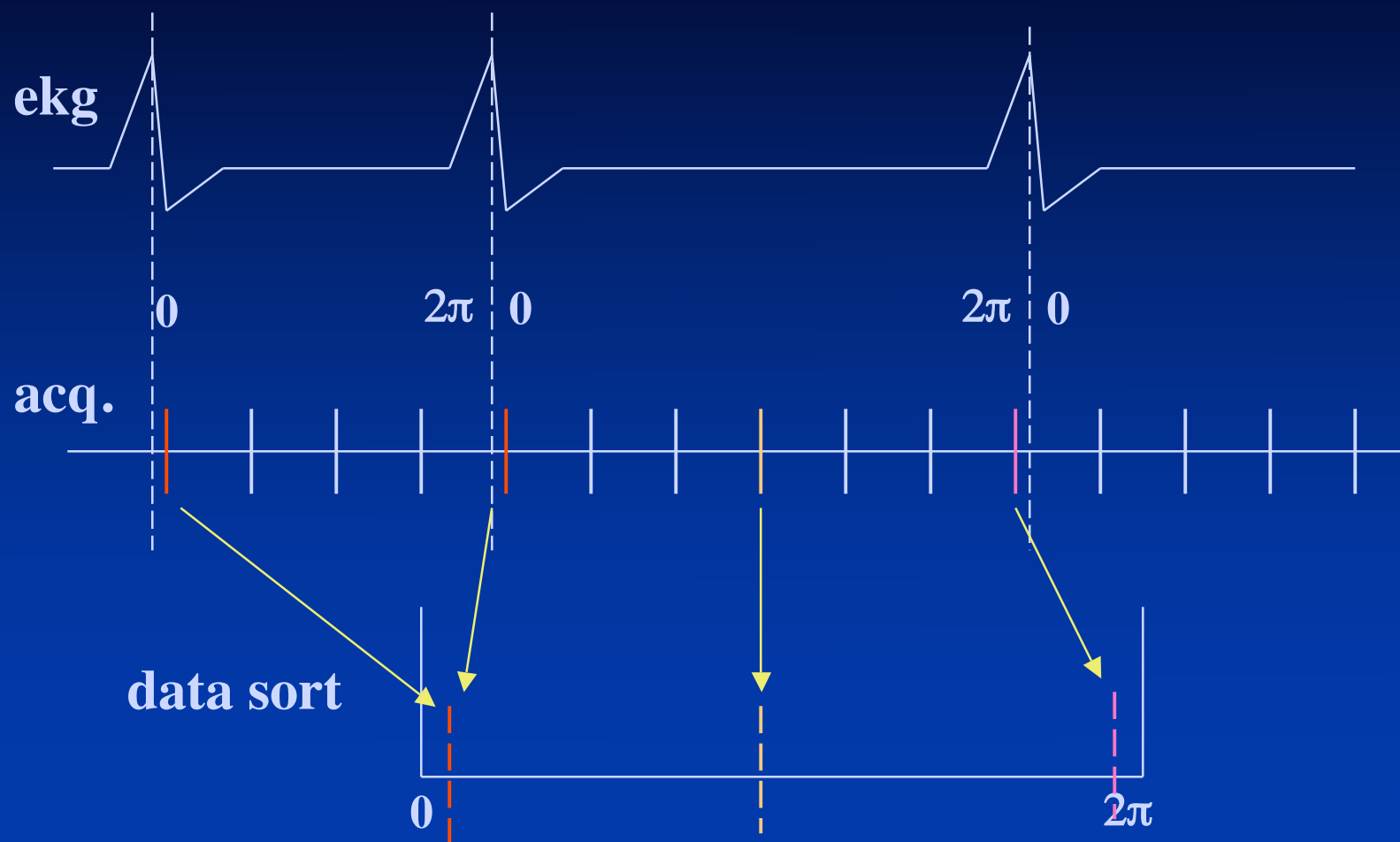
RVHRCOR

# Cardiac/Respiratory Noise



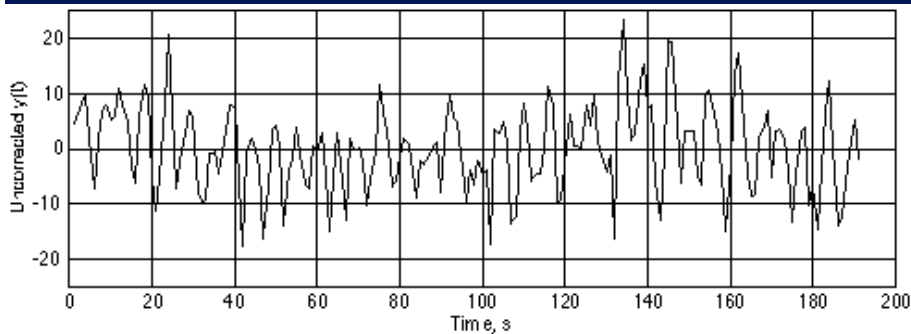
TR 250ms

# Retrospective sorting by cardiac phase

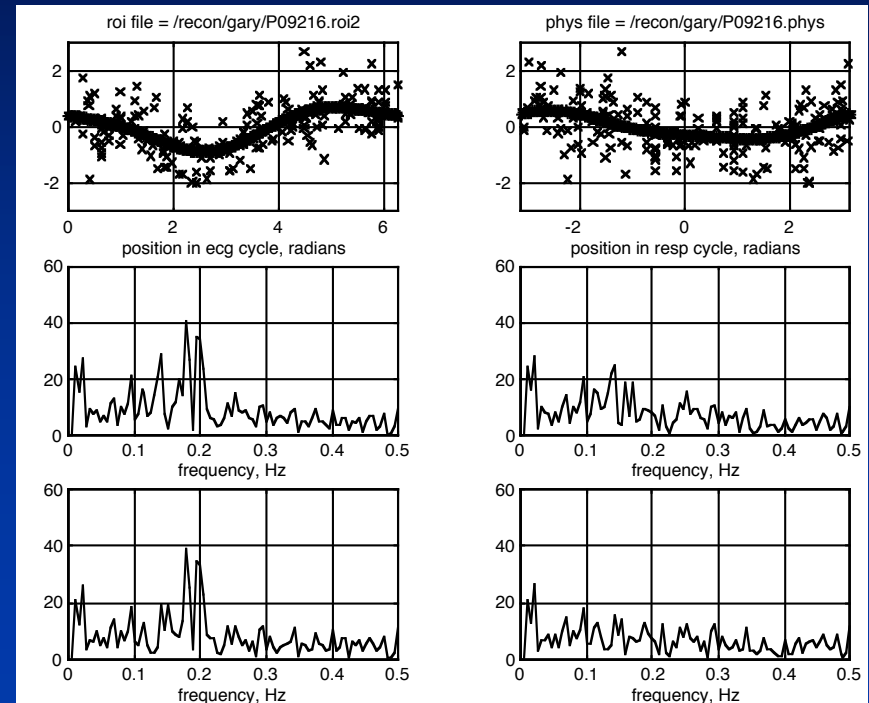
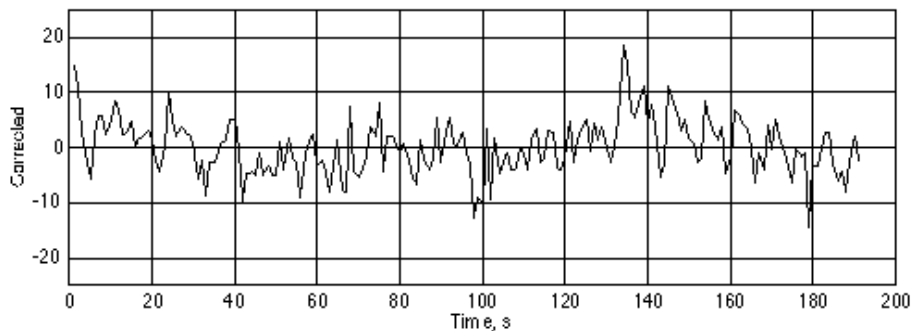


# Cardiac/Respiratory Motion Correction

## Timeseries in a voxel



## after correction



TR 1000ms



# Retrospective Corrections

---

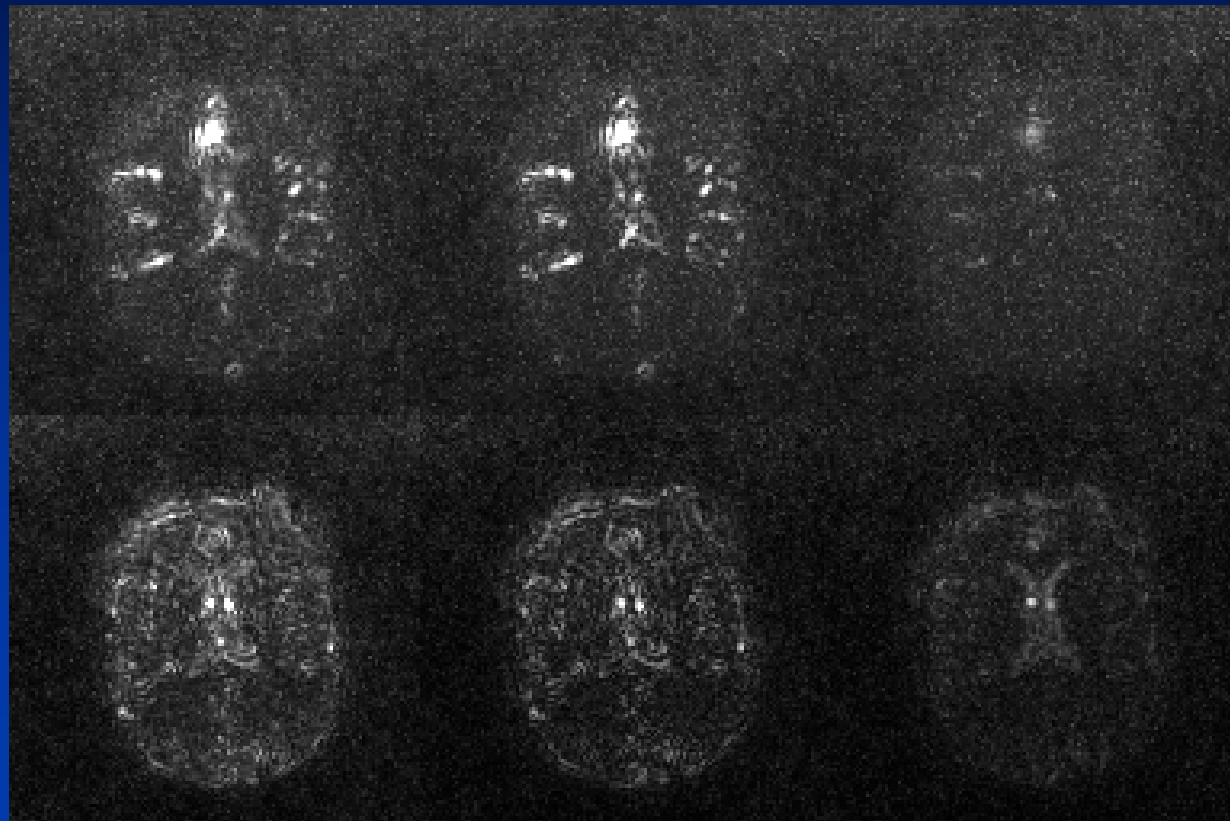
Before

K-space

I-space

ECG

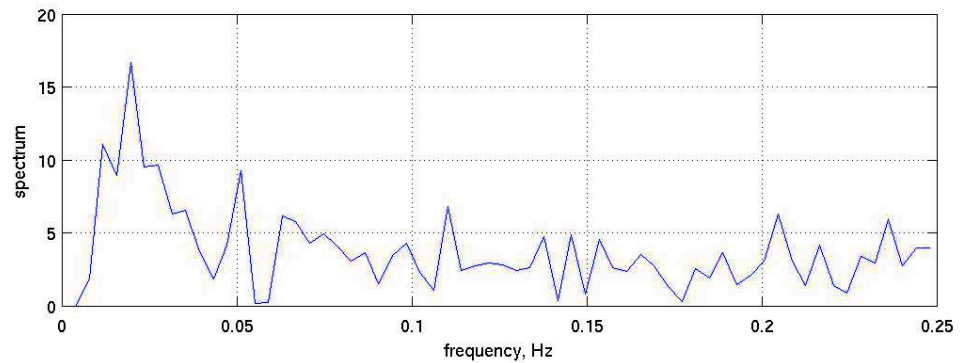
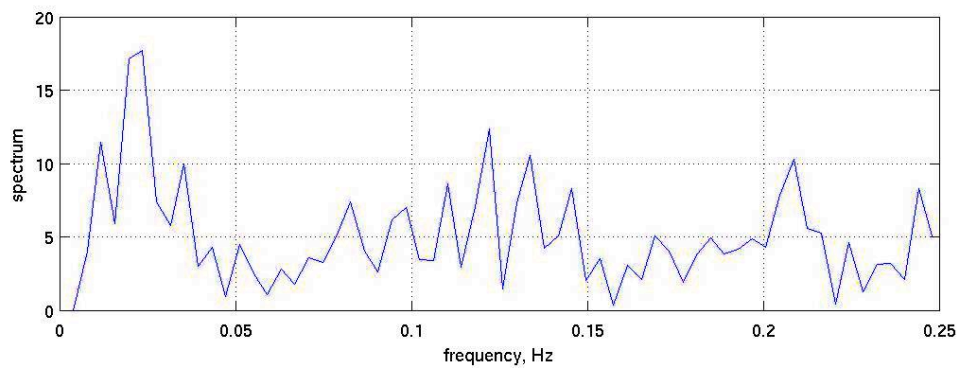
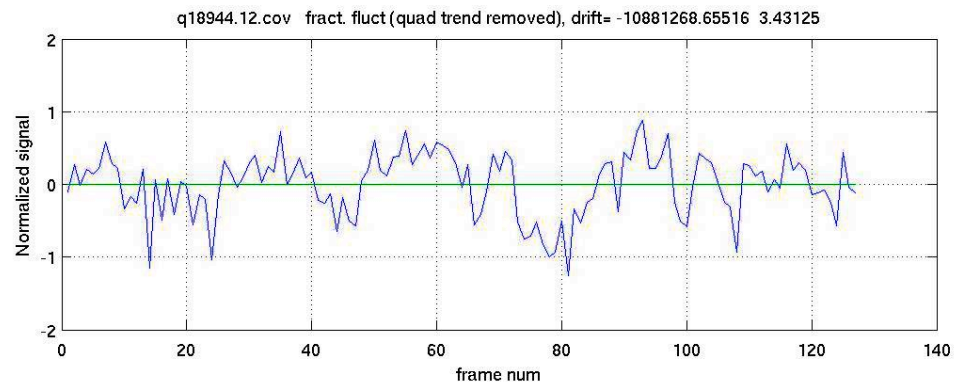
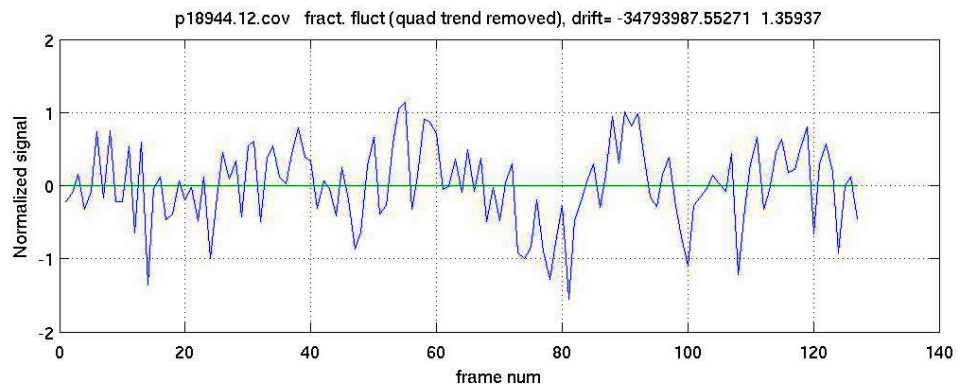
Resp



# Resting State

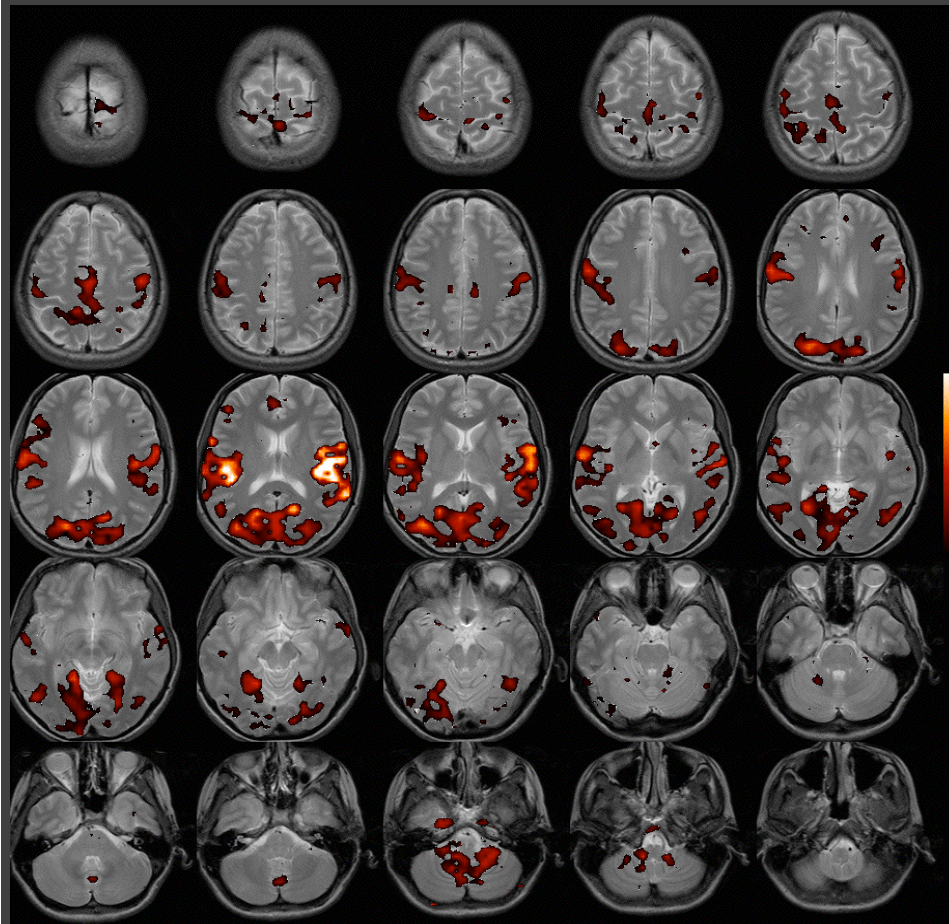
No retroicor

With retroicor

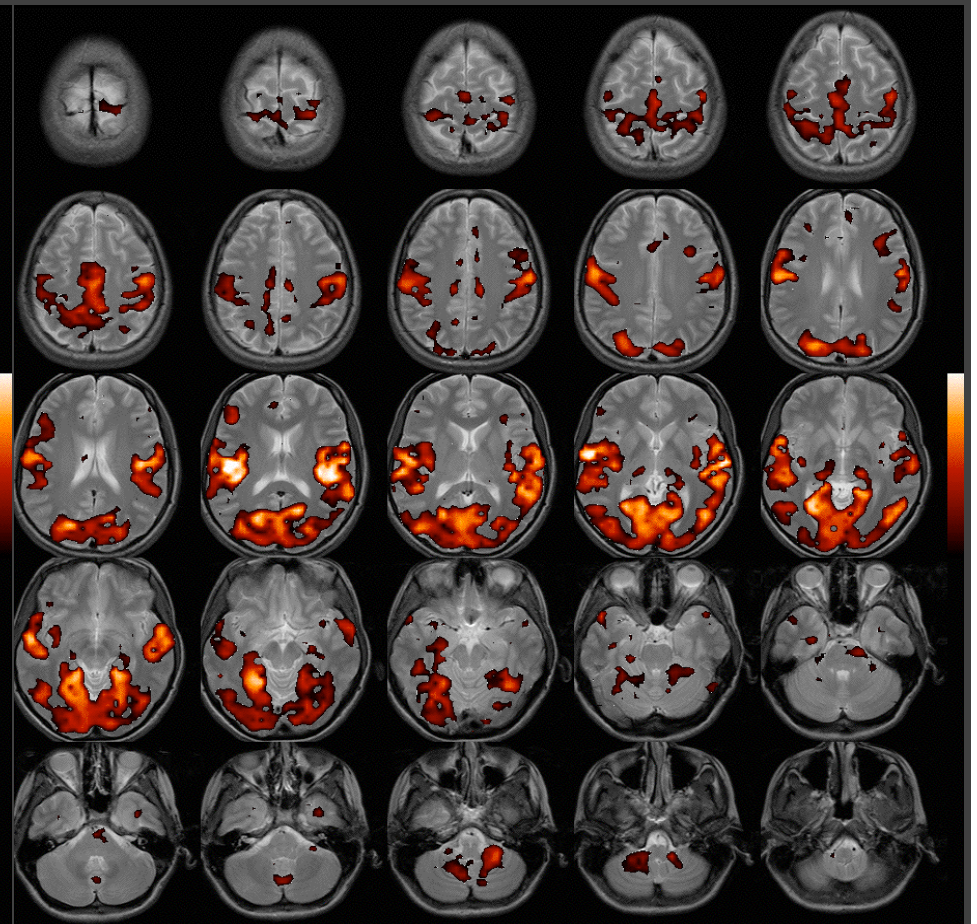


# RETROICOR

No retroicor



With retroicor



# Physio noise: reduction

---

- Neuronal activation

- Respiration cycle

- Cardiac cycle



RETROICOR

- Respiration volume ( $\approx \text{CO}_2$ )

- Heart rate

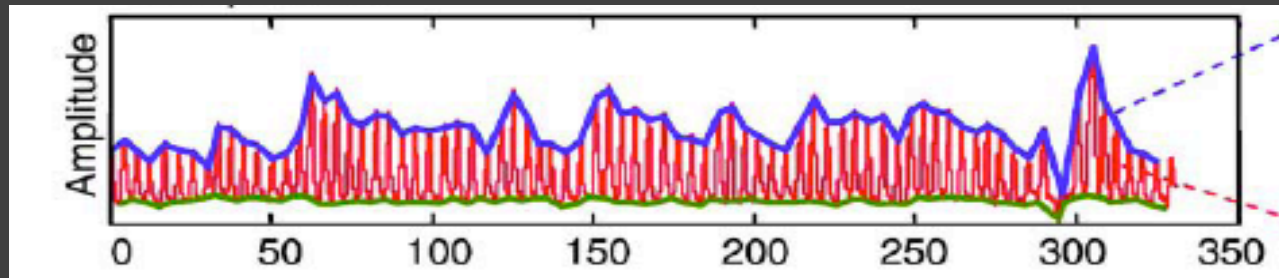


RVHRCOR



# Physio noise: sources

- Variation in respiration volume (per time)



Birn 2006

- Air intake is inversely related to the amount of  $\text{CO}_2$  in your blood.
  - $\text{CO}_2$  is a vasodilator (causes blood vessels to expand); this decreases vascular resistance, causing blood flow to increase
  - Known to affect BOLD (Wise, 2004)
- Heart rate
  - Affect cerebral blood flow (CBF)/volume; coupled to respiration
  - Not well known!



# Physio noise: RVHRCOR

---

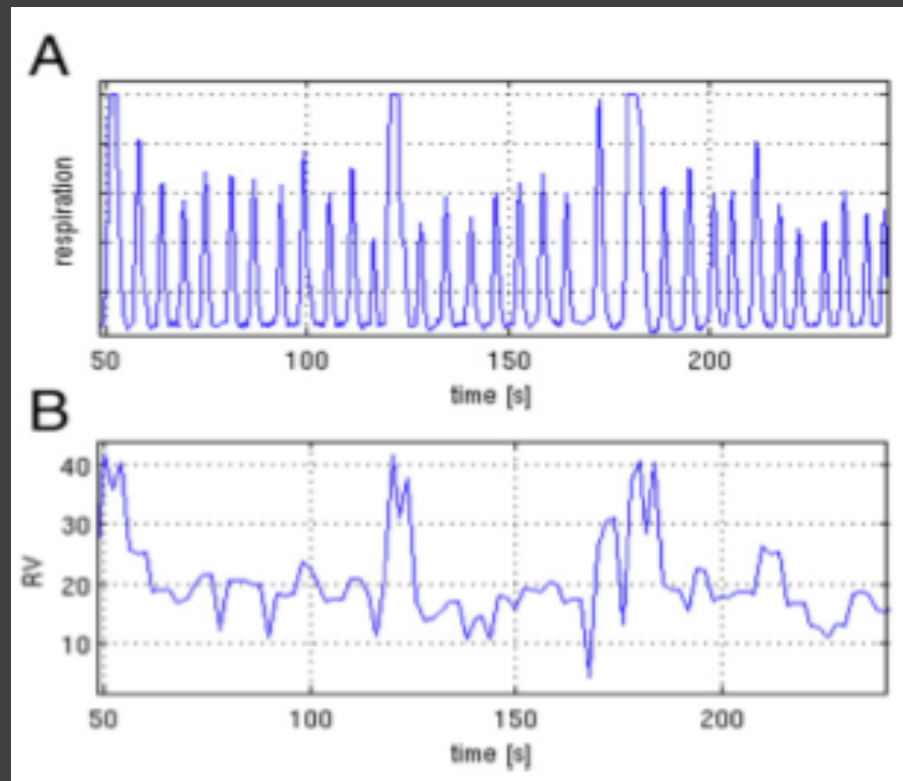
- Method to remove artifacts due to low-frequency respiration (RV) and heart rate (HR) (Chang et al, 2009, Birn et al., 2008)

- Model:  
Voxel time series =  $\underbrace{RV \otimes RRF}_{\text{RV-related}} + \underbrace{HR \otimes CRF}_{\text{HR-related}} + (\text{brain signal, etc.})$   
 $\underbrace{\hspace{10em}}_{\text{Remove these}}$

- $\otimes$  denotes convolution.
- $RRF$  and  $CRF$  are impulse responses that describe the mapping between  $RV \leftrightarrow \text{BOLD signal}$ , and  $HR \leftrightarrow \text{BOLD signal}$ , respectively (just like the hemodynamic response function (HRF) maps between stimuli  $\leftrightarrow$  BOLD signal)

# RVHRCOR: RV

1. Compute RVT from the raw respiration trace



resp

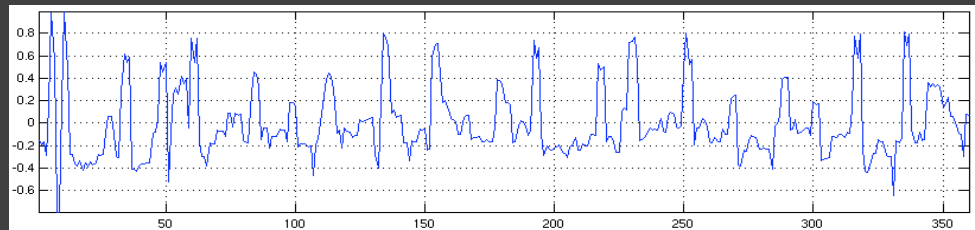


RVT

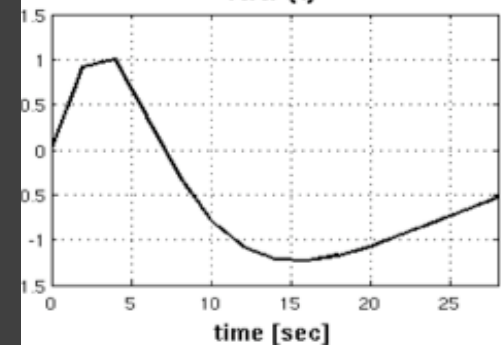
# RVHRCOR: RV

## 2. Convolve RVT with the RRF

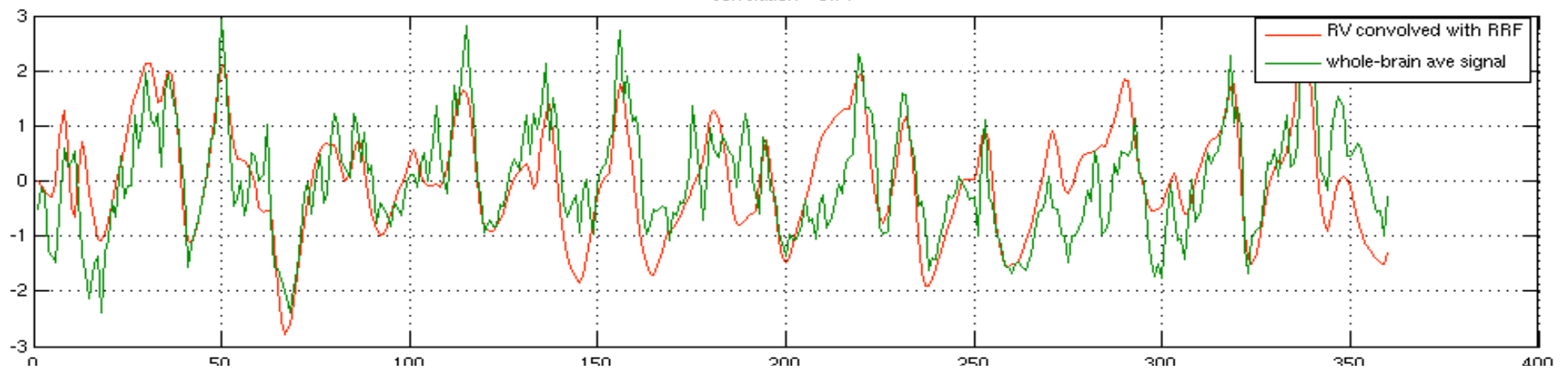
RV



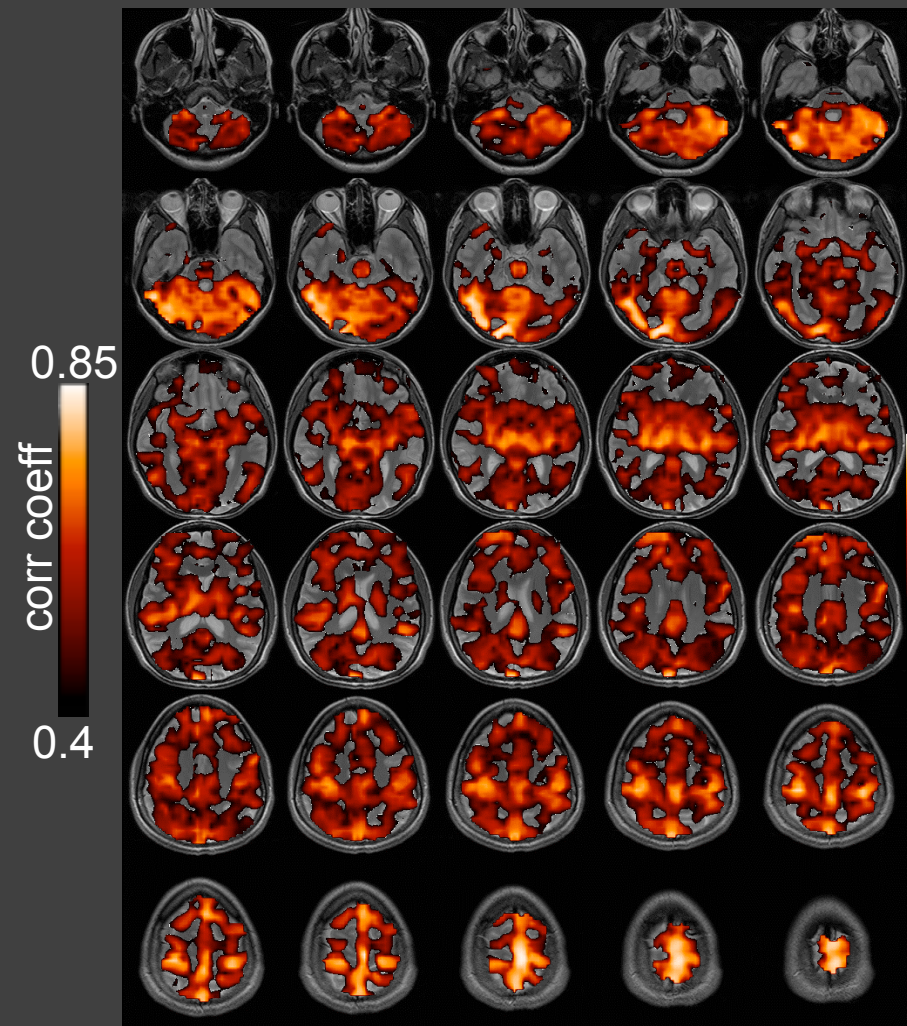
RRF(t)



correlation = 0.71



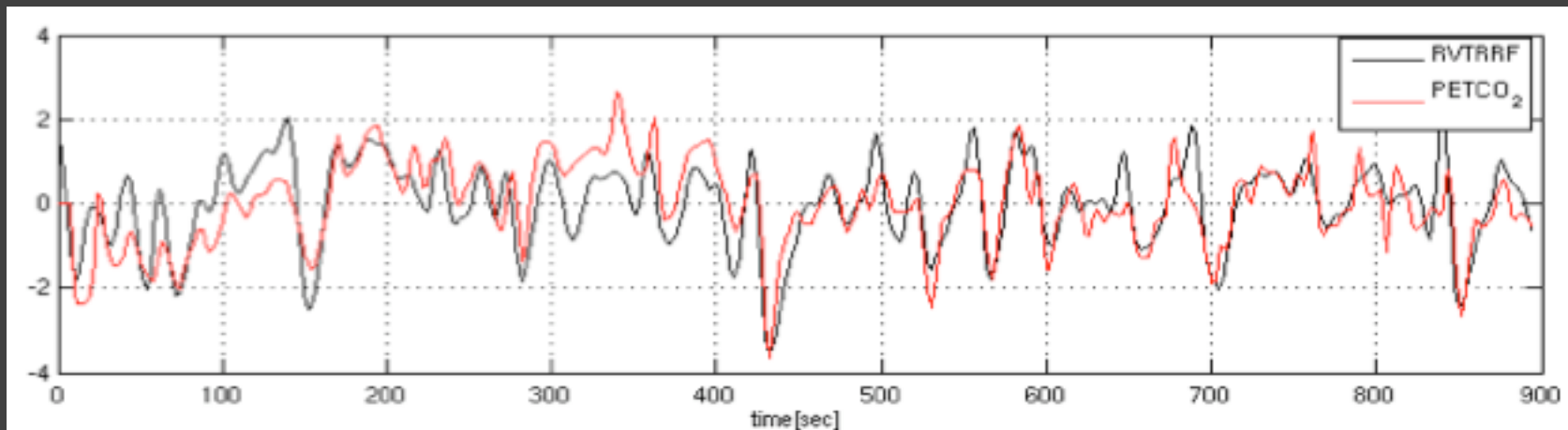
# RVHRCOR: RV



- Correlation between  $RV_x$  and each voxel

$$RV_X \approx CO_2$$

(after shifting  $CO_2$  forward by about 10s)



- $RV(T) \sim \text{ventilation} \sim 1/PaCO_2$
- So, model could be:  $RV \rightarrow CO_2 \text{ changes} \rightarrow \text{BOLD changes}$

Chang, 2009

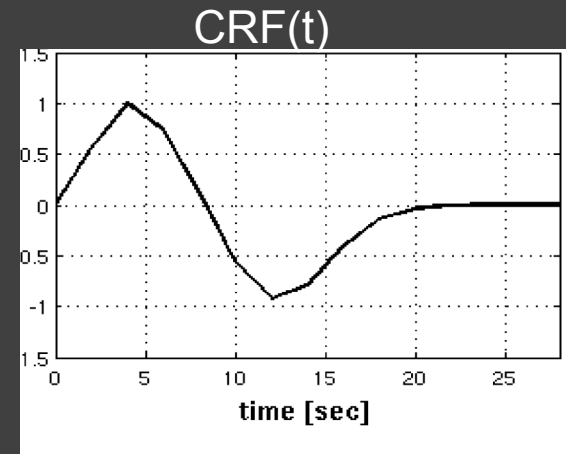
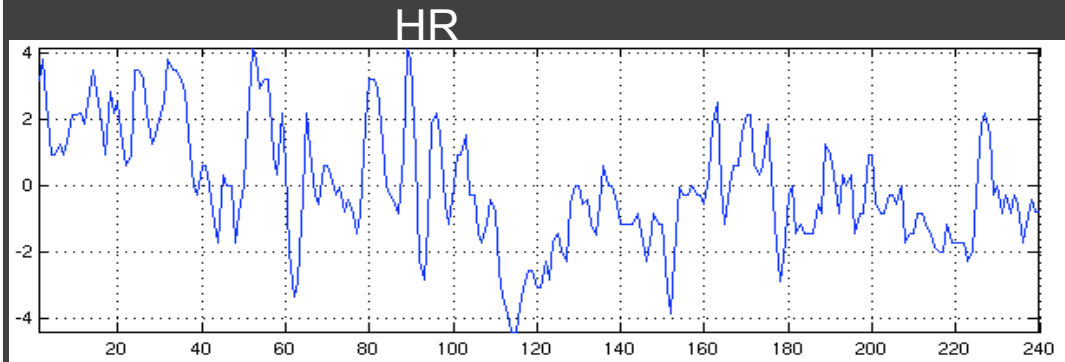


# RVHRCOR: HR

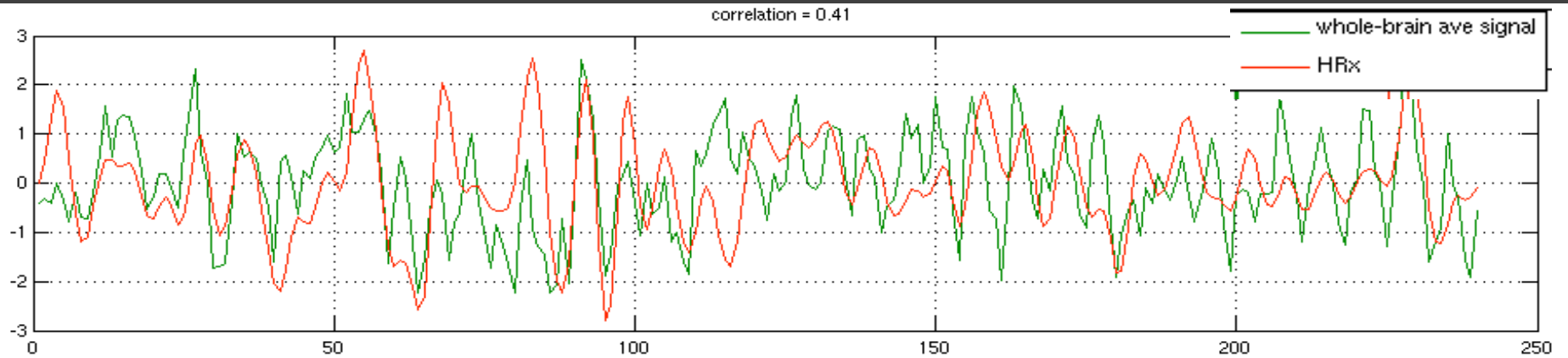
---

- RV:
  1. Compute RV from the raw respiration trace
  2. Convolve RV with the RRF
- HR:
  1. Compute HR from the cardiac/PPG triggers
  2. Convolve HR with the CRF

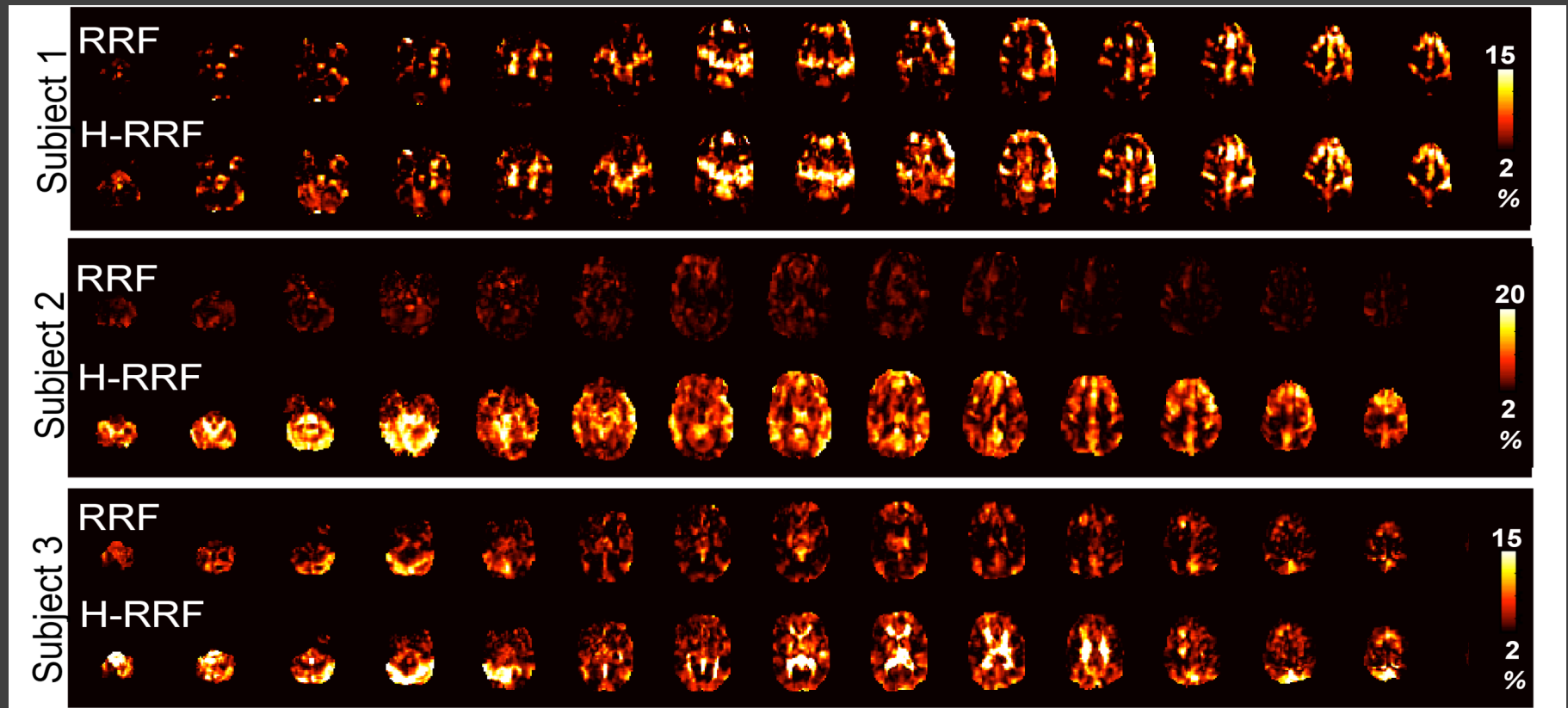
# Cardiac response function (CRF)



correlation = 0.41



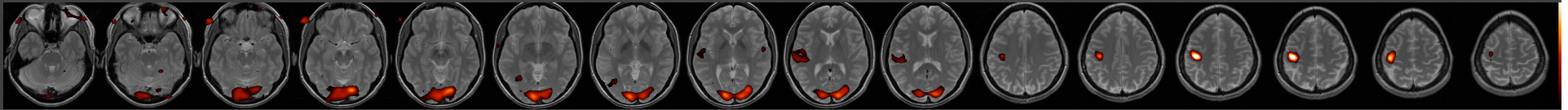
# Variance explained: $RV_x$ & $HR_x$



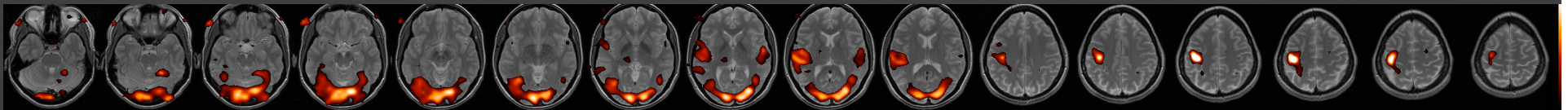
# Impact on activation: SM task

---

Retroicor only

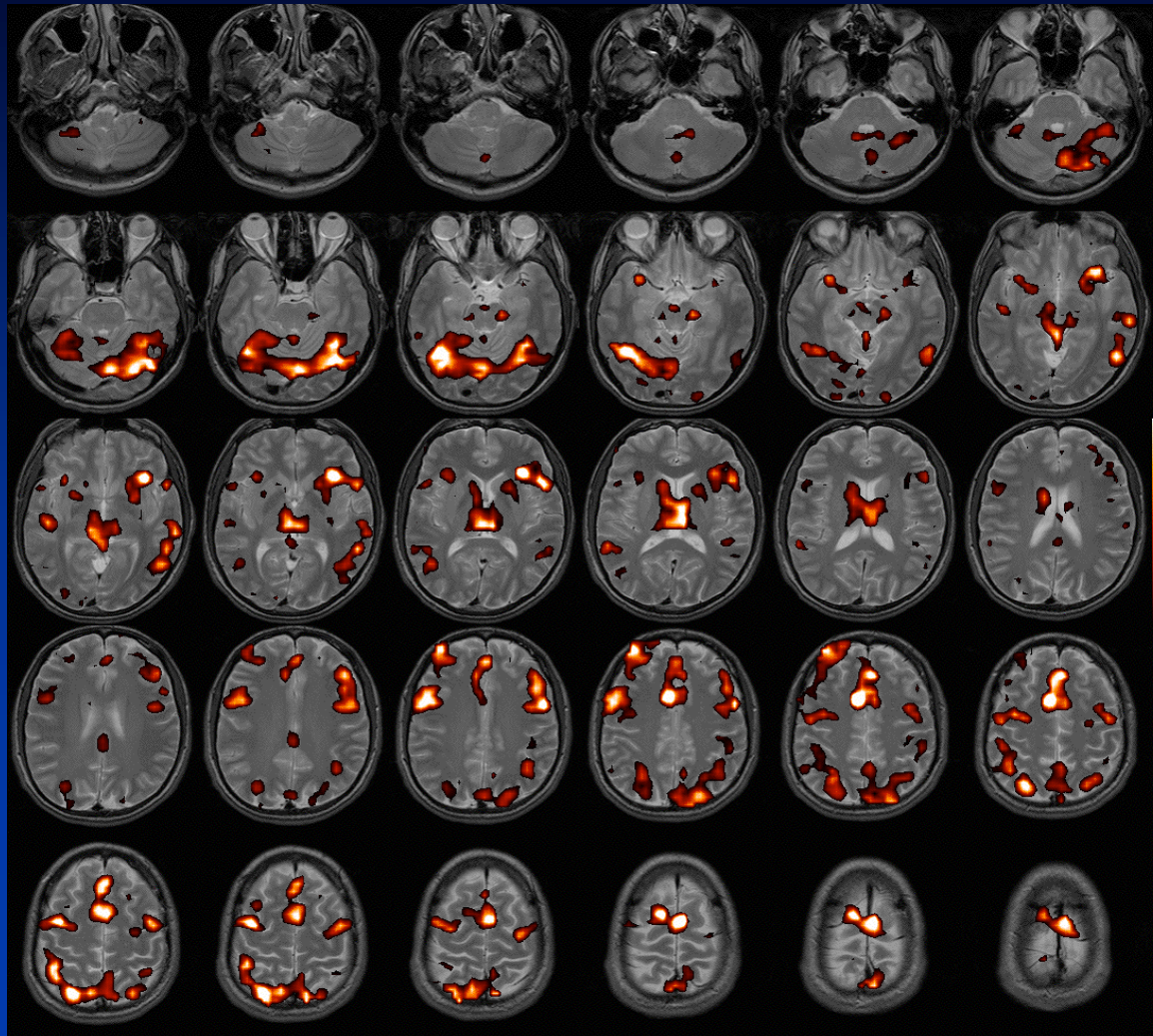


Retroicor & rvhrcor



T maps: after - before

# Impact on WM task



WM Activation increases  
(corrected - uncorrected)  
 $T=0.1-1.0$

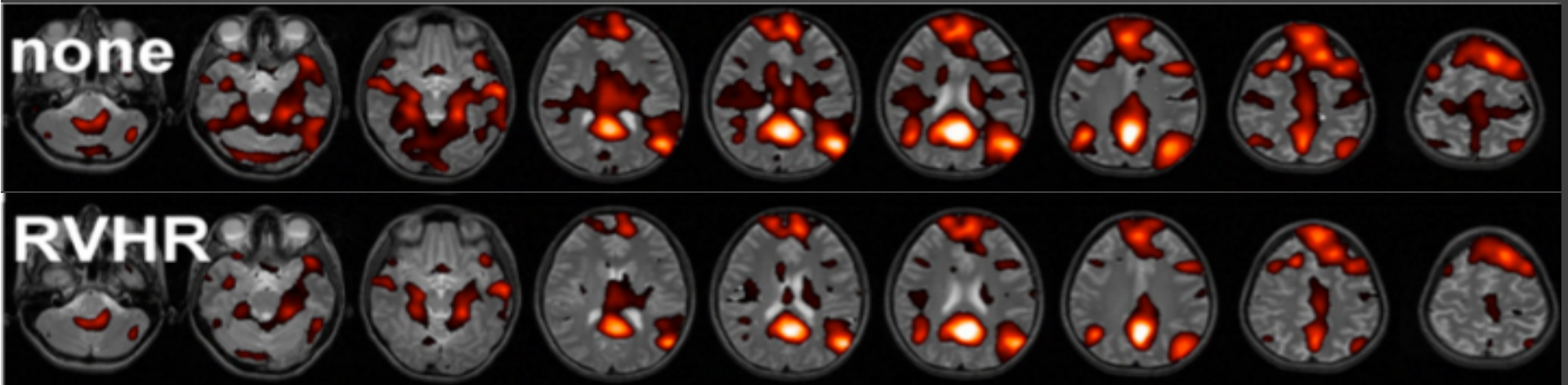
Chang et. Al  
(2009)



# Impact on resting-state networks

---

- Decreases “false” positive correlations w/ default-mode

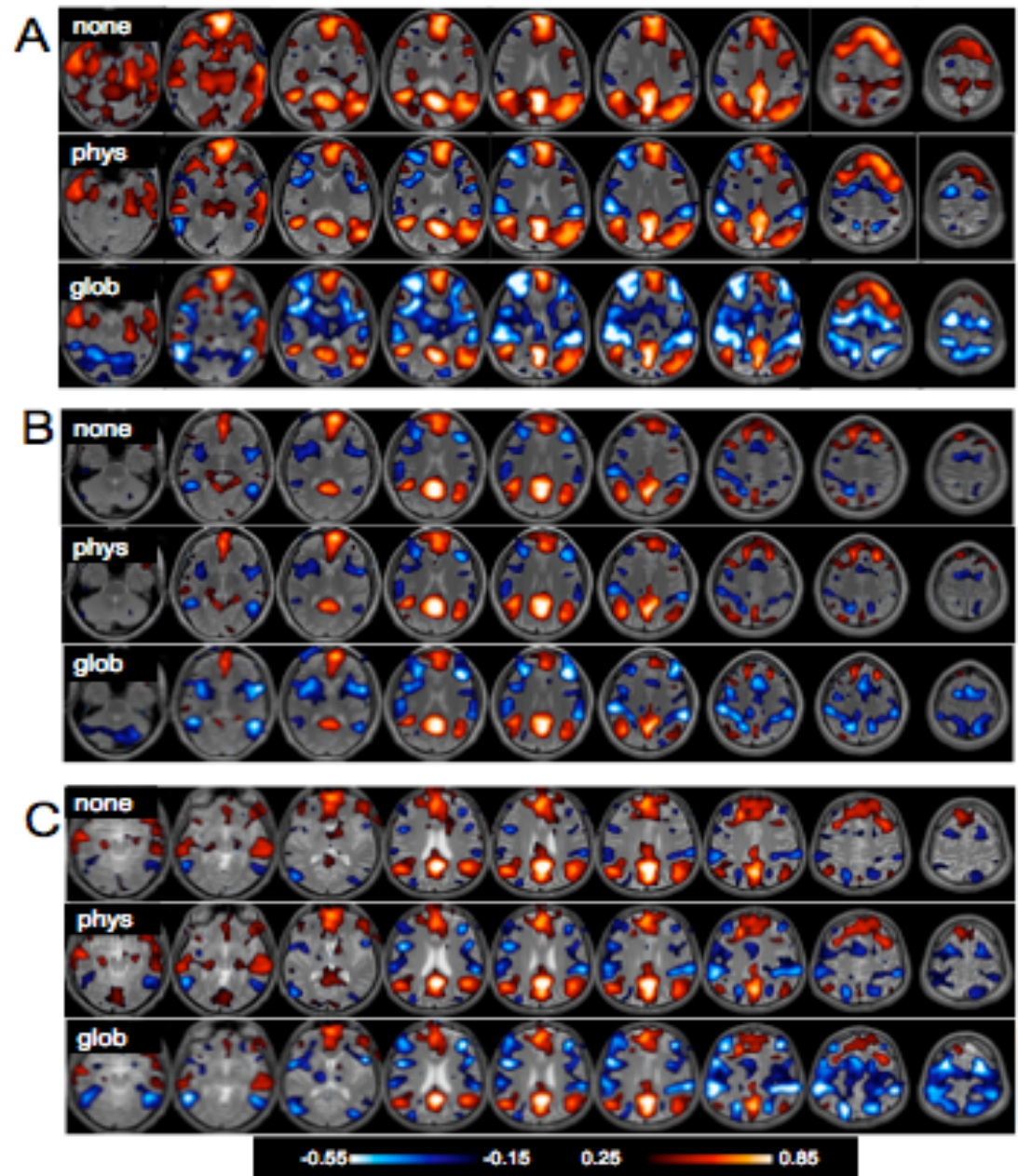


# Impact on resting-state networks

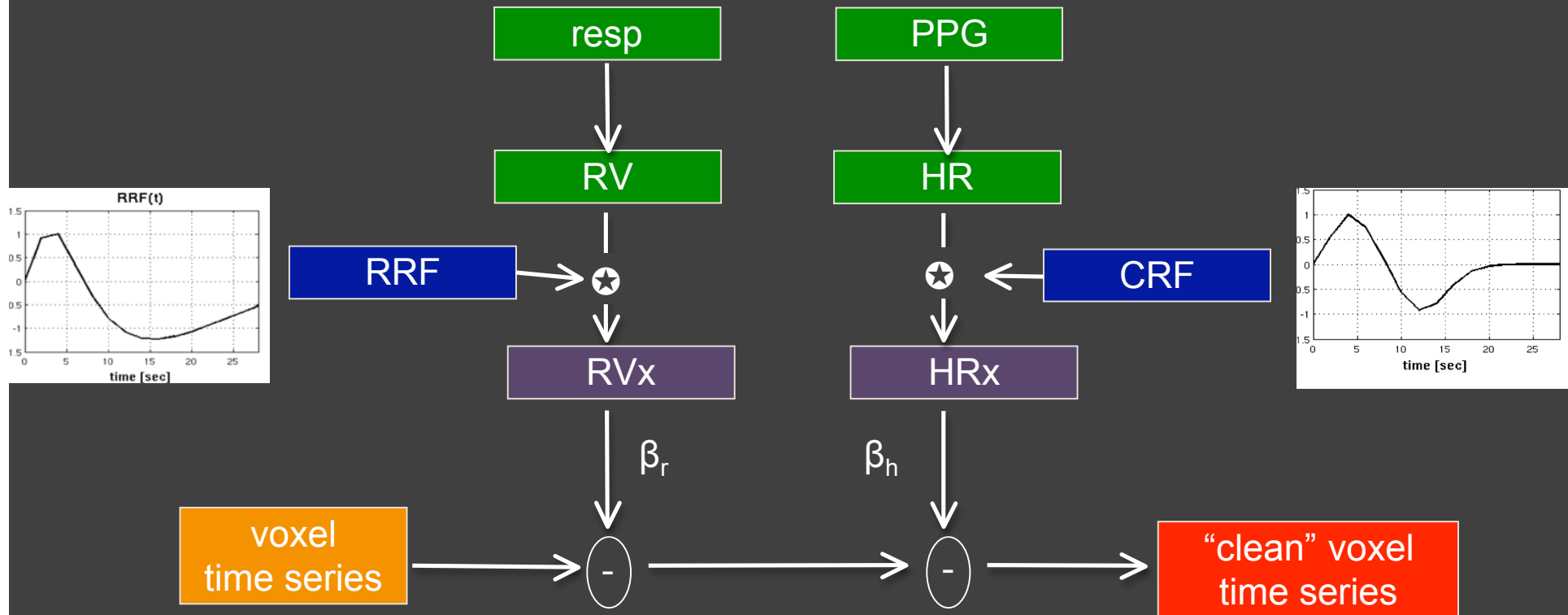
Correction can

- reduce spurious “connectivity” in DFM
- increase anticorrelated network connectivity

Chang et al., 2009



# RVHRCOR: Summary



# Outline

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- Issues with fMRI reliability
- Reducing confounds
  - HRF
  - calibration of vasoreactivity
  - latency
- Physiological noise
- **Multicenter studies**

# Multicenter Neuroimaging Studies

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- Potential use of MRI/fMRI as a biomarker
  - structural/functional differences may predict disease;  
large study numbers are necessary for biodiversity
  - monitoring drug efficacy or other therapy
- Generate large data sets rapidly
- Access wide or targeted demographic characteristics
- Provide image databases for other analyses

# Multicenter MRI

---

- **Desire to pool results across sites equally requires standardization**
- **Different vendors may have incompatible characteristics/ definitions- e.g.**
  - **pulse sequence contrast in FSPGR vs MPRAGE**
  - **meaning of BW/echo spacing in EPI imaging -> artifacts/SNR**
  - **k-space apodization filters -> smoothness/CNR**
  - **grad distortion correction**
  - **geometric calibration precision**
  - **temporal stability**



# Multicenter MRI

---

- Need to qualify sites for entry into study
  - characteristics for acceptance
    - geometric accuracy
    - contrast/resolution
    - SNR, CNR, tSNR (SFNR)
    - temporal stability
    - reliability/reproducibility
    - artifacts (ghosts/distortion/eddy current-related, ...)
  - understand sensitivity of scanner characteristics relative to desired measurements
- Set criteria for acceptance
- Need to maintain minimum performance standards
  - develop a QA program

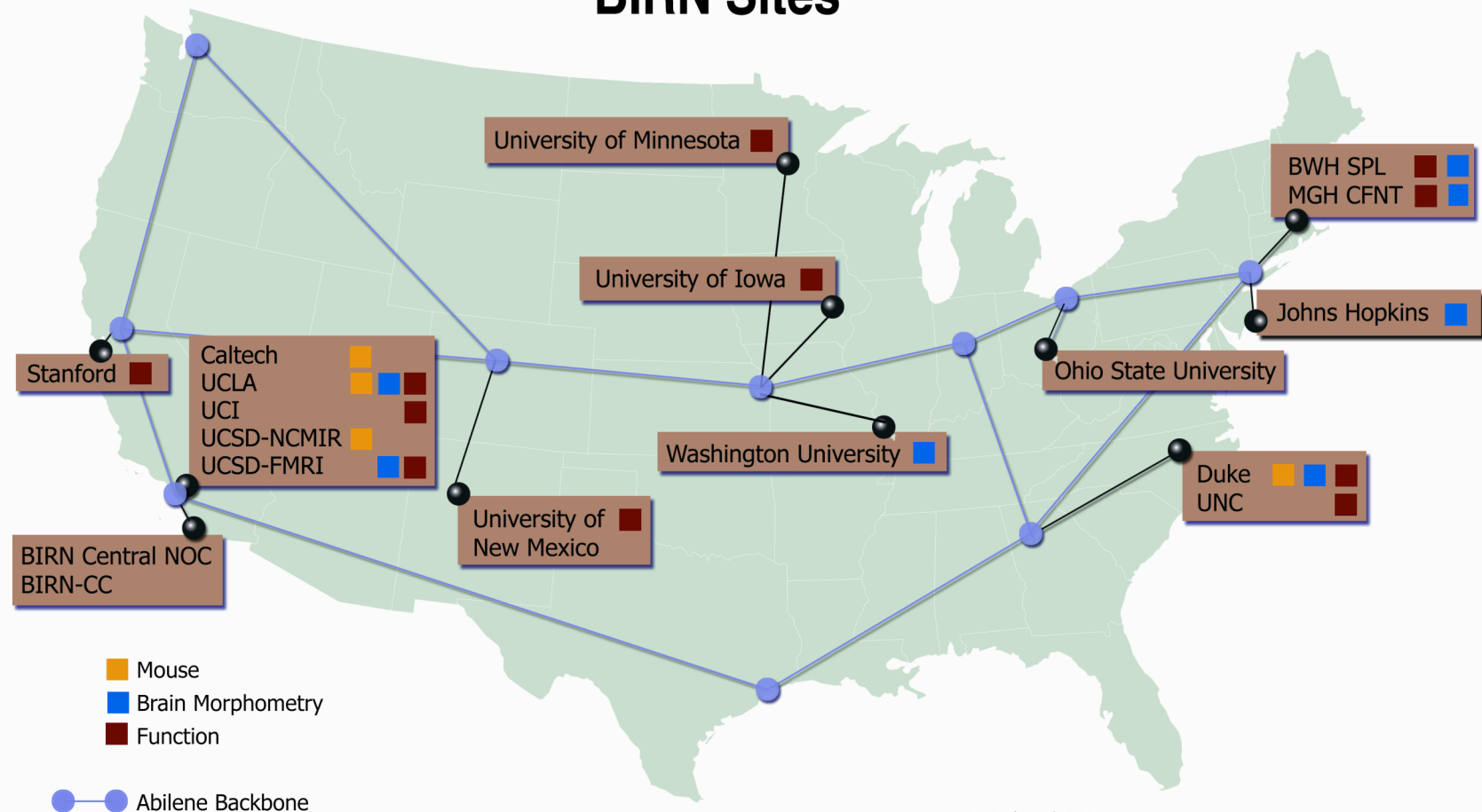
# Multicenter MRI

---

- **Decide policy for upgrades (chances virtually 100% for at least one site to upgrade )**
  - **minor: software only**
  - **major: hardware & software**
- **Develop procedures to control for/reduce site effects**
- **Develop procedures to reduce data acquisition confounds, e.g. hemodynamics in BOLD fMRI- test scientific question**

# Multicenter MRI

## BIRN Sites



Revised March 8, 2004

# fBIRN

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- **Goal: Develop methods for pooling fMRI data on schizophrenics at each of 11 centers**
  - load manipulation in emotional WM
- **Approaches: Reduce intersite/intersubject variability**
  - scanner QA
  - measure/calibrate/normalize
    - BOLD sensitivity
    - HRF/vasoreactivity

# Issues in multicenter studies

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- **Standardization of protocols**
- QA
- Site Equalization

# Standardization

---

- Study design
- Acquisition parameters
- Scanner characteristics
- Study procedures
- Analysis pipeline
- Database structures



# fMRI Imaging Characteristics

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## Modest importance:

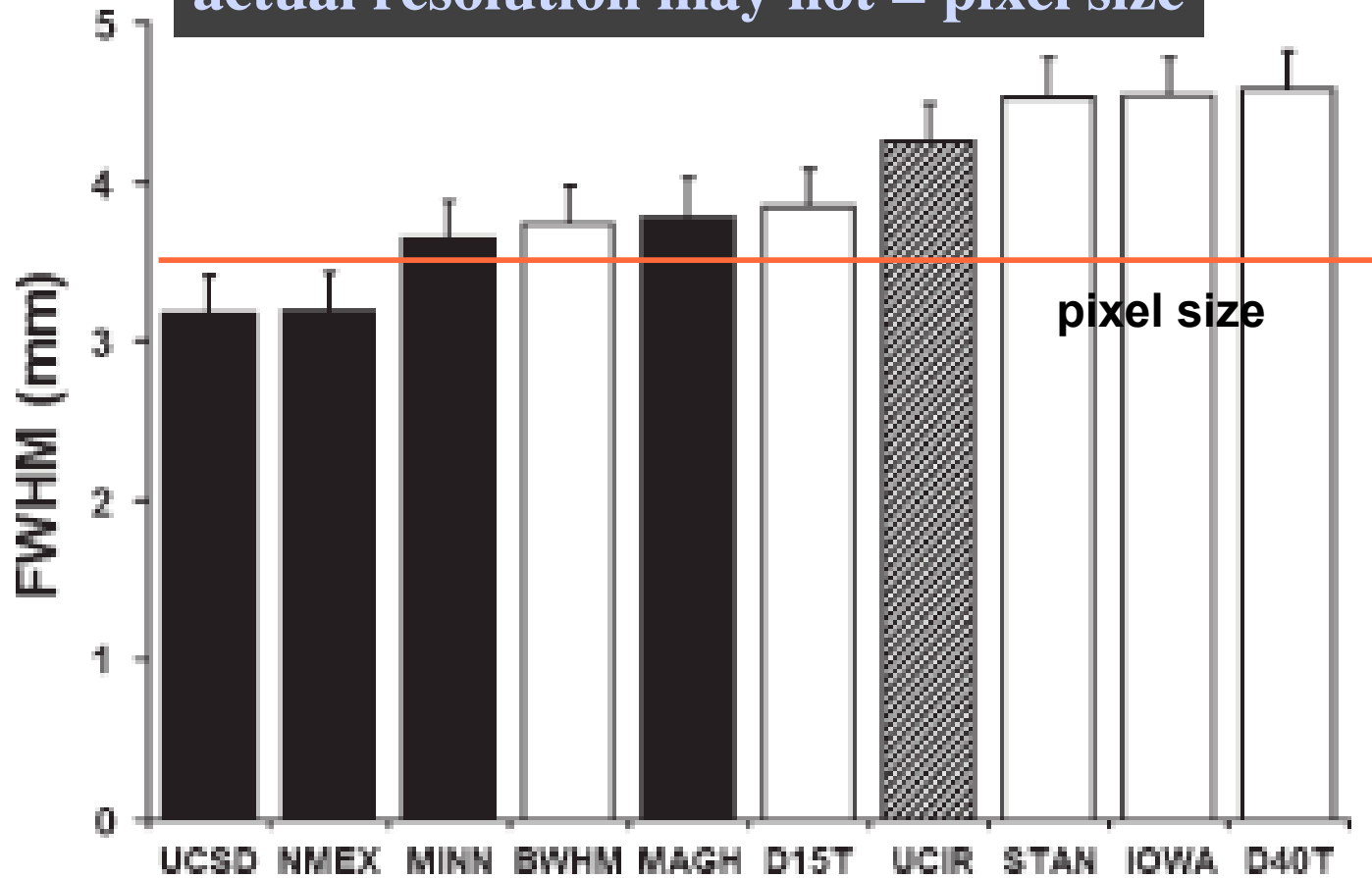
- Geometric accuracy (since fMRI is low resolution- e.g.  $3.4 \times 3.4 \times 4 \text{ mm}^3$ )

## Highest importance:

- Stability (short/long term)
- BOLD CNR- B1 uniformity (coil choice)
- Susceptibility-induced distortion/dropout (seq. params)
- Ghost/spike noise/other artifacts
- Standardization across vendors

# Intersite smoothness differences

actual resolution may not = pixel size



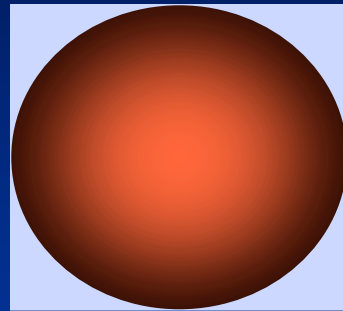
Friedman et al. NI (2006)

# Why smoothness differences?

- k-space reconstruction kernel

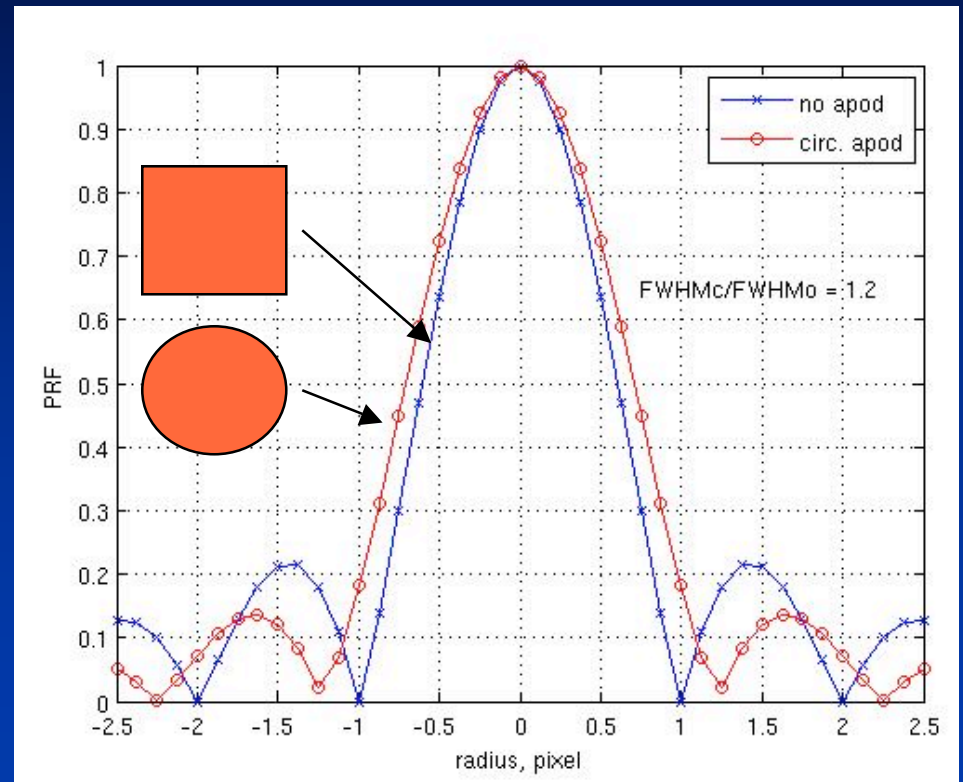


Vender “S”



Vender “G”

- Apodization- lower resolution, higher SNR



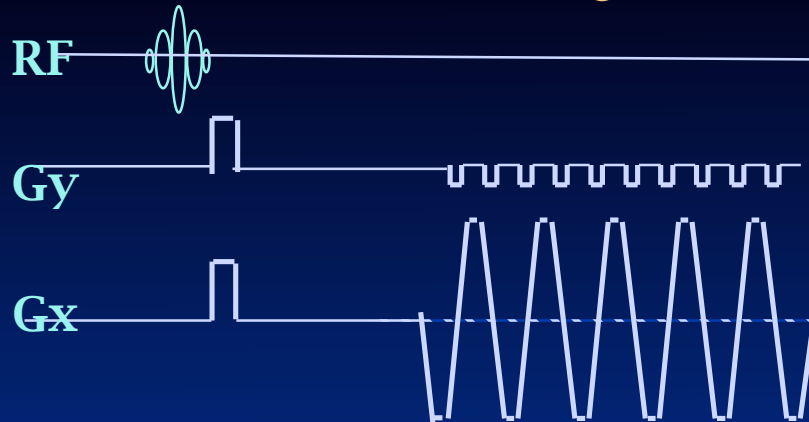
# Important fMRI Characteristics

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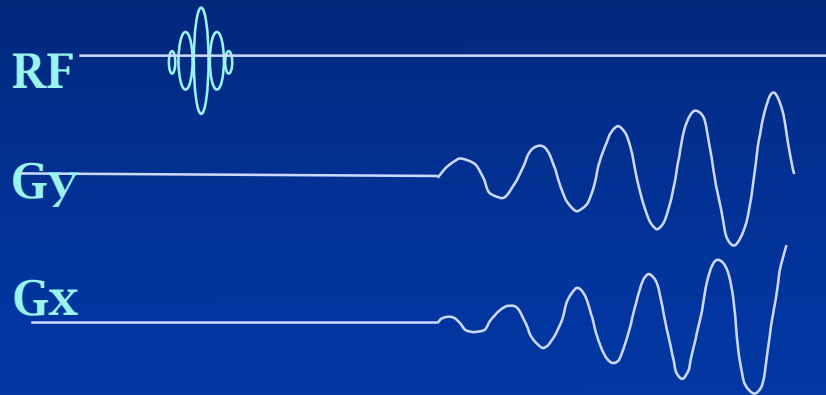
- fMRI acquisition contrast/smoothness
  - control parameters:
    - resolution/smoothness (resel != FOV/matrix\_size)
    - BW: keep ESP constant across vendors**
    - slice spacing/skip/orientation**
    - fat saturation vs. water excitation**
    - readout trajectory (EPI vs. spiral), affects smoothness, artifacts**
    - field strength (affects SNR, CNR, vessels vs. tissue, artifacts)**

## Trajectory

EPI



Spiral



- affects resolution, motion sensitivity, SNR, num slices/TR

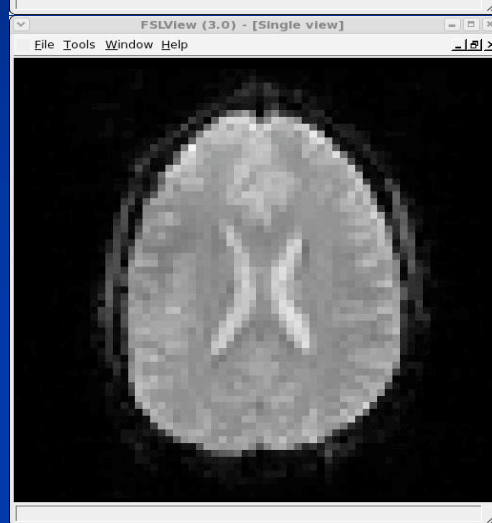
# RF Excitation/Slice Select

---

Spectral-Spatial  
(default for  
GE EPI)



FATSAT  
(default for  
Siemens EPI)



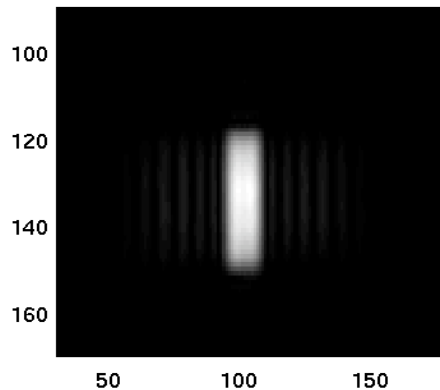
Bryon Mueller  
(UMinn)



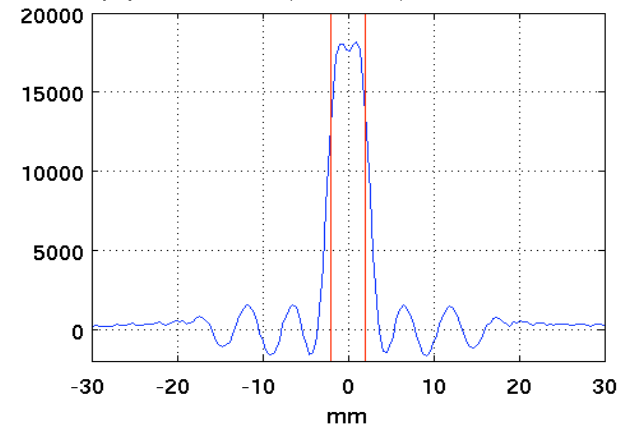
# Measured Slice Profile

spectral-spatial

spsp, 256x64, 4 shot, fov 10cm

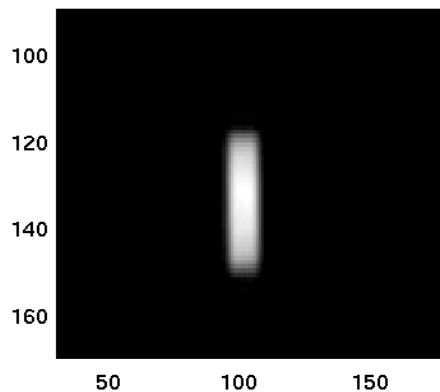


spsp, slthick 4mm (eff 4.8618), fwhm 4.9219 mm

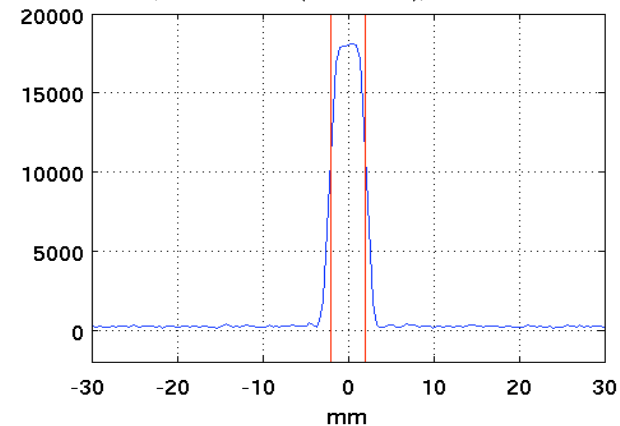


fat sat

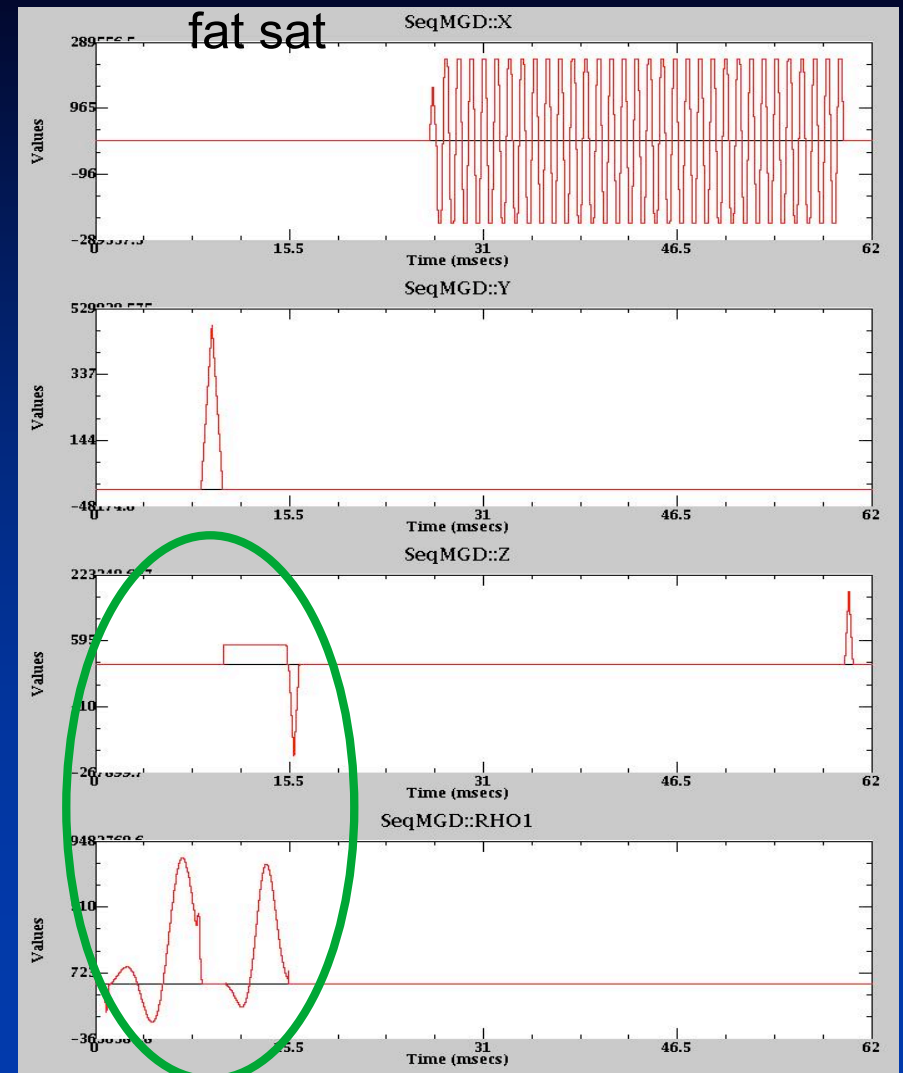
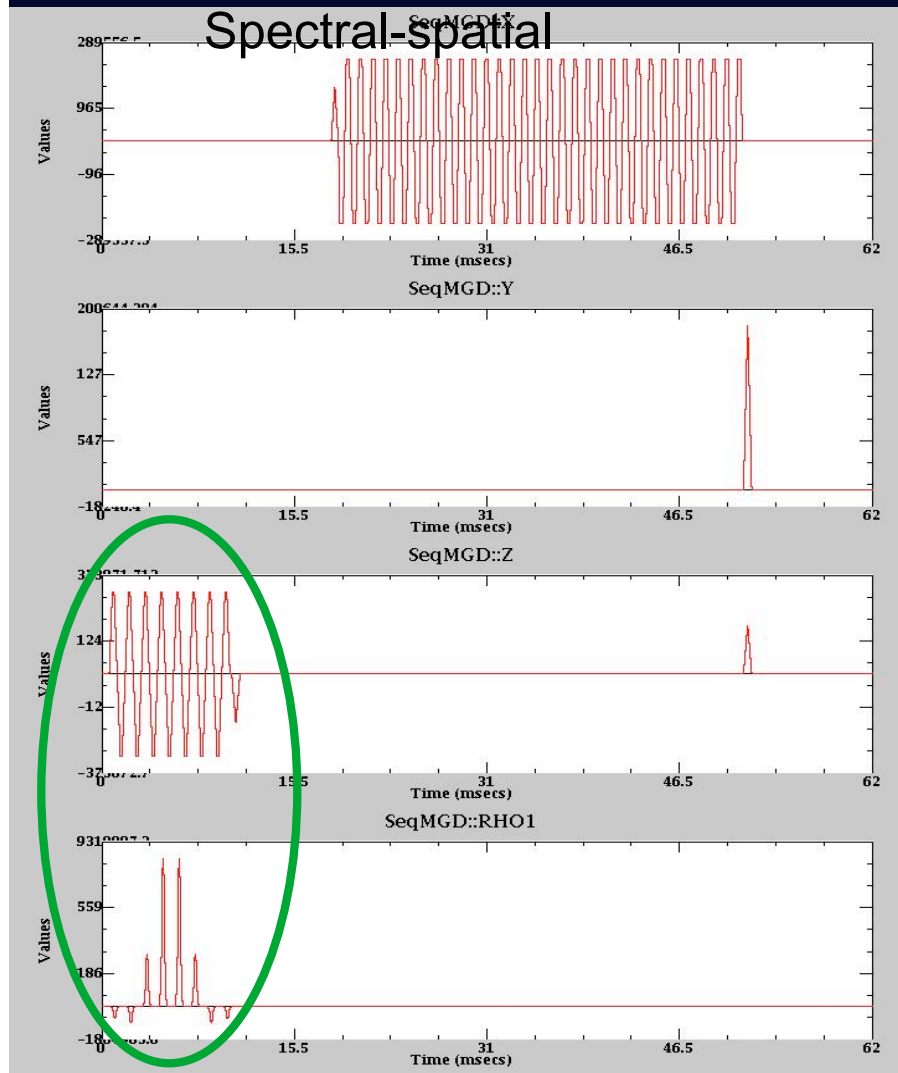
fatsat, 256x64, 4 shot, fov 10cm



fatsat, slthick 4mm (eff 4.3797), fwhm 4.377 mm



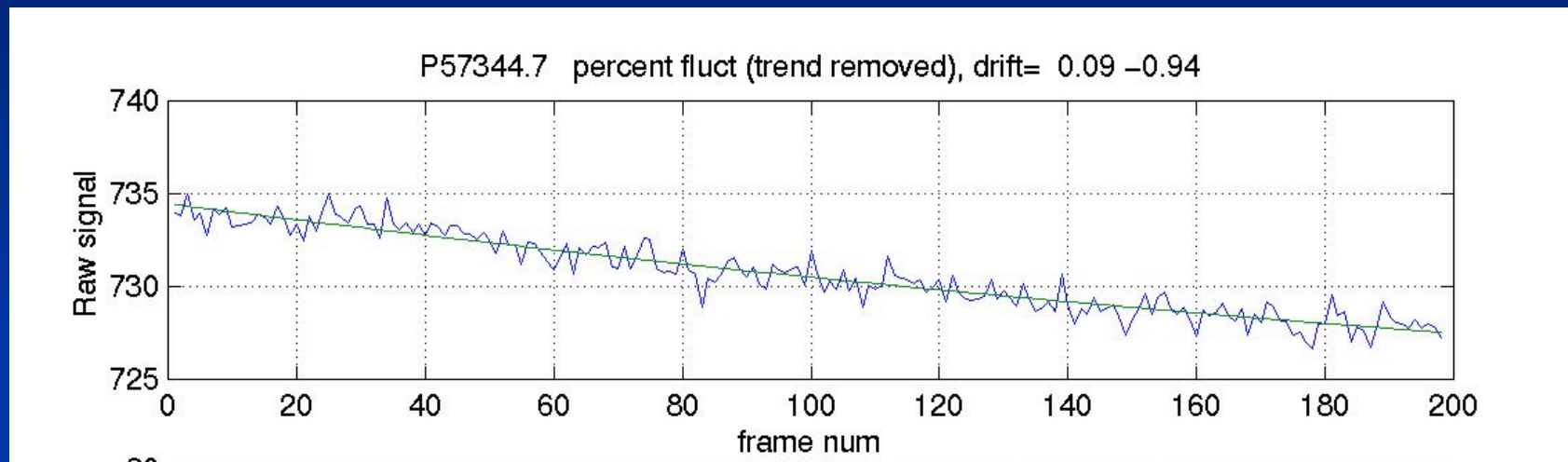
# Slice select



# Important MRI Characteristics

- Dynamic image stability

fMRI & ASL depend on subtraction to compare conditions  
scanner stability must be  $\ll$  brain noise



# Brain noise relative to thermal noise: to set acceptance criteria

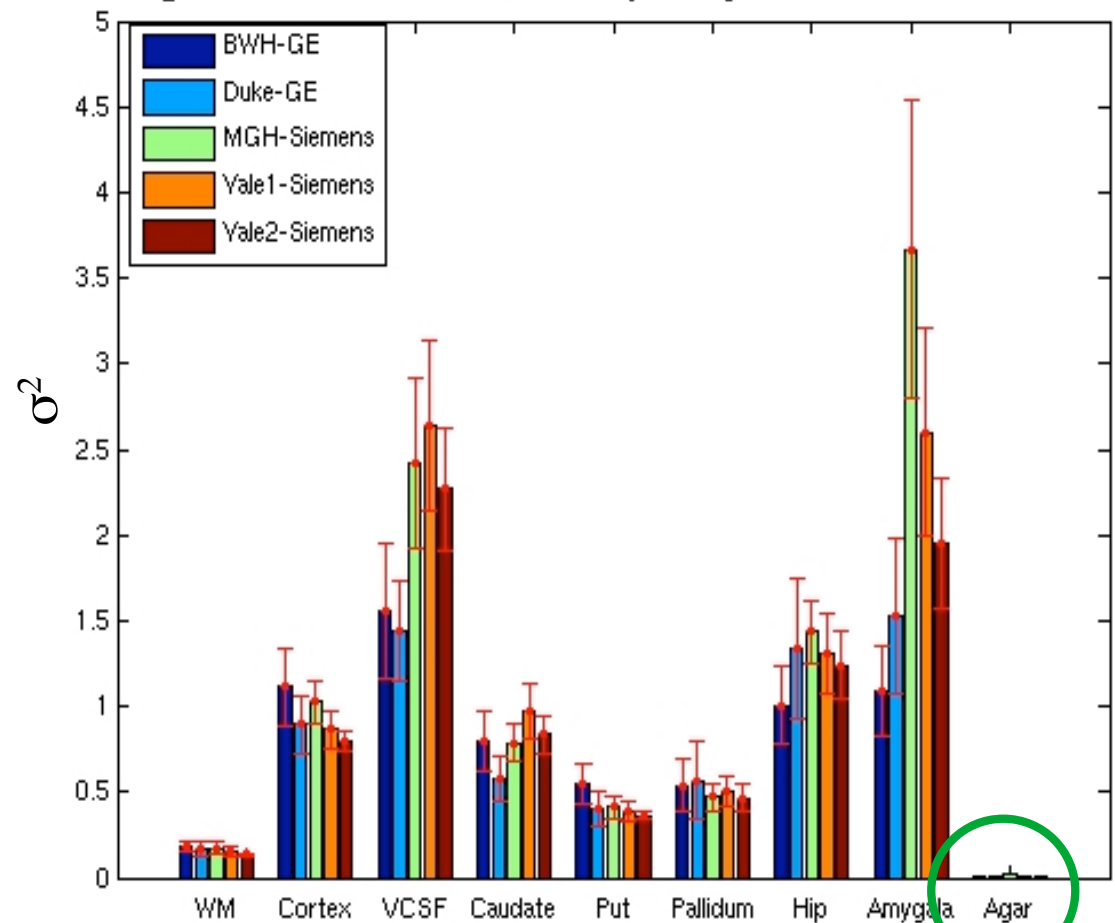
$$\begin{aligned}\sigma^2 &= \sigma_0^2 + \sigma_s^2 + \sigma_p^2 \\ &= \sigma_0^2 + (\lambda_s + \lambda_p)S^2(\alpha)\end{aligned}$$

G. Krueger (MRM 2000)

- Acquire data at 10°, 77°
- Calc fraction of scanner/  
brain noise vs. thermal  
noise, using human &  
phantom scans

D. Greve (MGH,  
ISMRM 2008)

Figure 1: Relative Variance of Spatially Encoded Noise at 77°



# Issues in multicenter studies

---

- Standardization of protocols
- QA
- Site Equalization

# QA: What to measure?

---

- Time series image stability
- Signal to noise ratio
- Signal intensity
- Xmtr/Rcvr Gains
- MRS characteristics
- Eddy currents
- Geometric accuracy

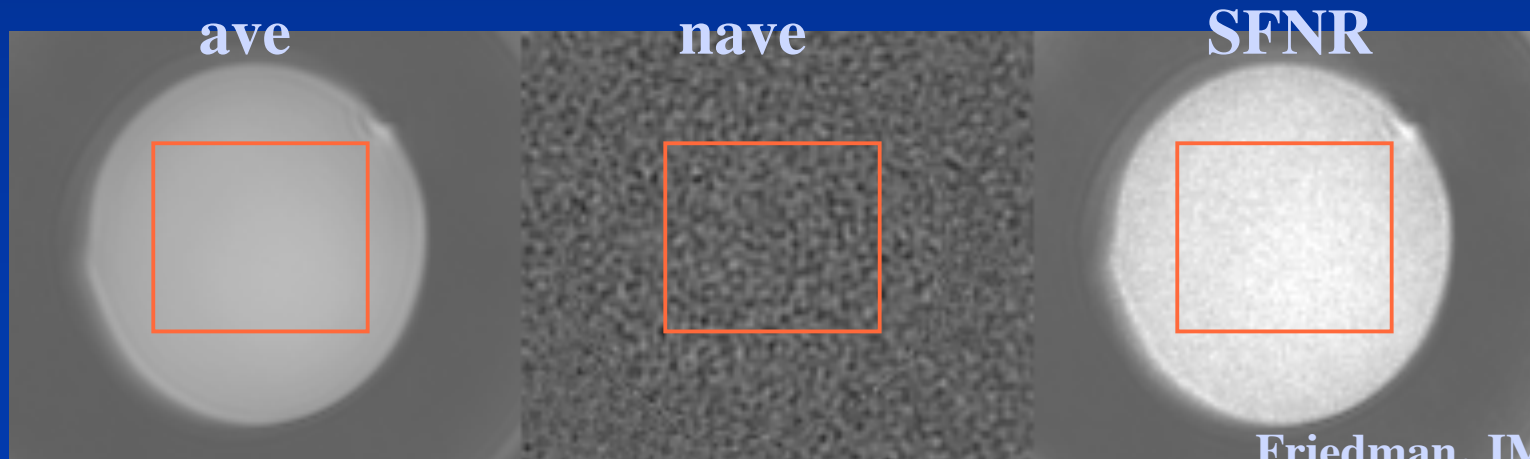


# SNR, SFNR

$$I_{even} = \frac{2}{N_{even}} \sum I_i - I_{trend}(i) \quad I_{odd} = \frac{2}{N_{odd}} \sum I_i - I_{trend}(i)$$

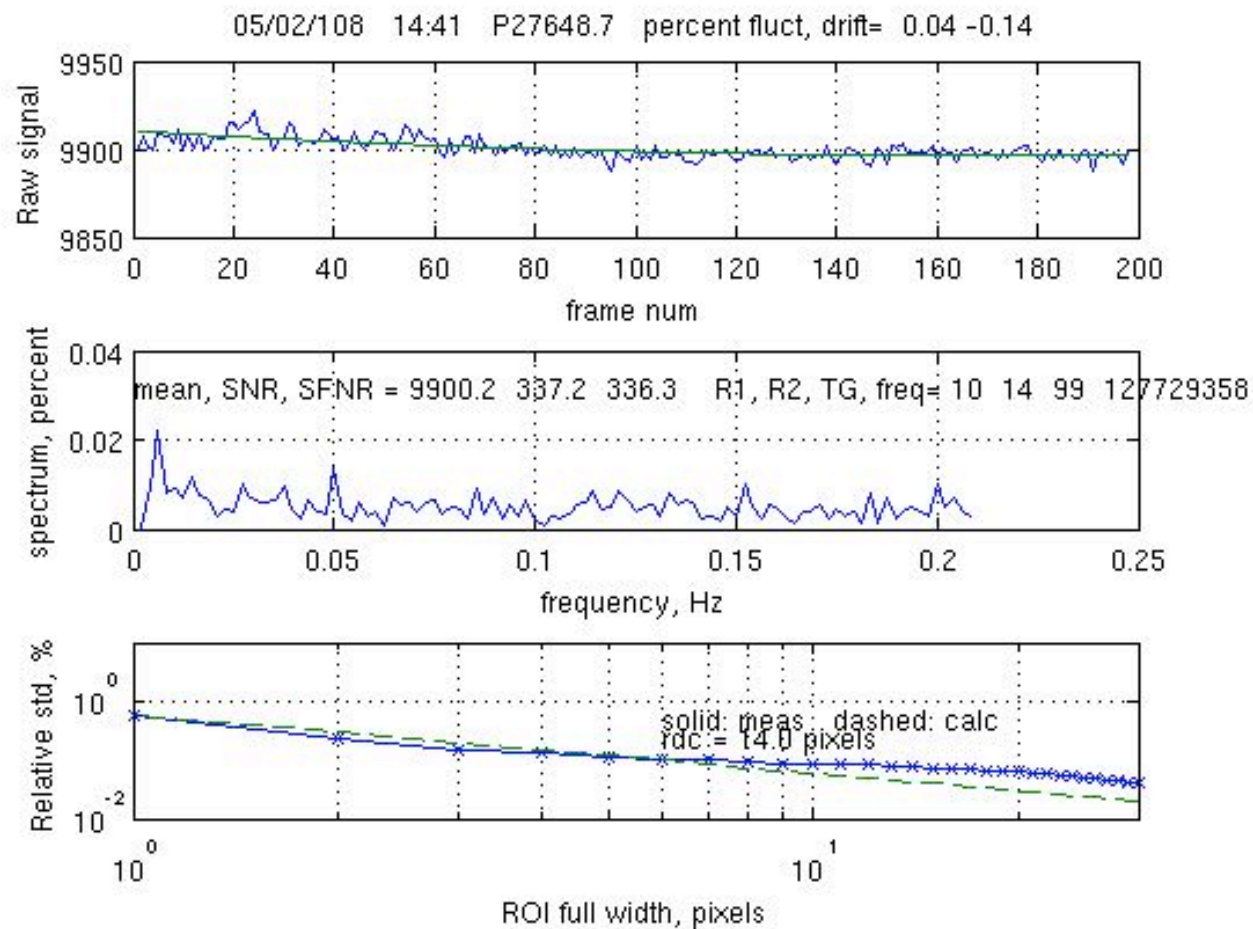
$$I_{ave} = \frac{1}{2}(I_{even} + I_{odd}) \quad I_{nave} = \frac{1}{2}(I_{even} - I_{odd})$$

$$\sigma^2 = \frac{1}{N-1} \sum [I_i - I_{trend}(i)]^2 \quad SFNR = I_{ave} / \sigma$$



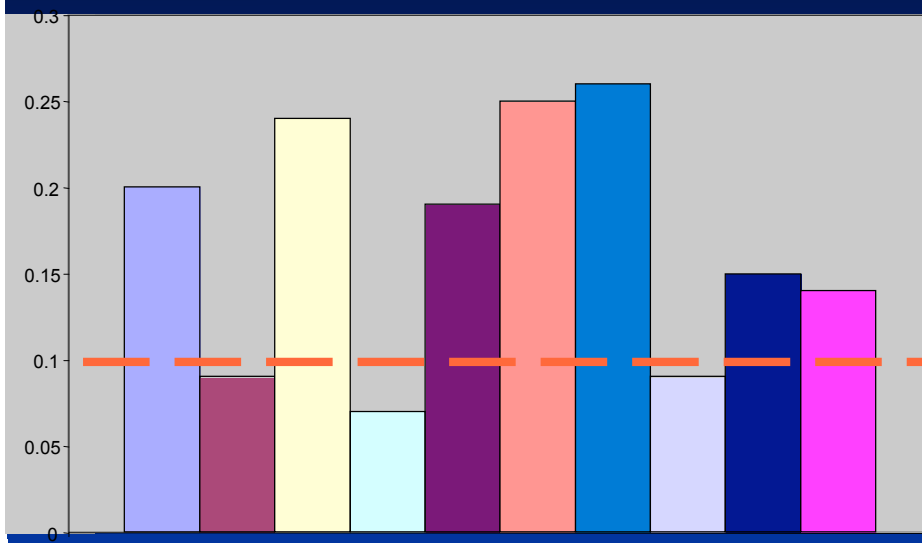
Friedman, JMRI 2006

# Stability

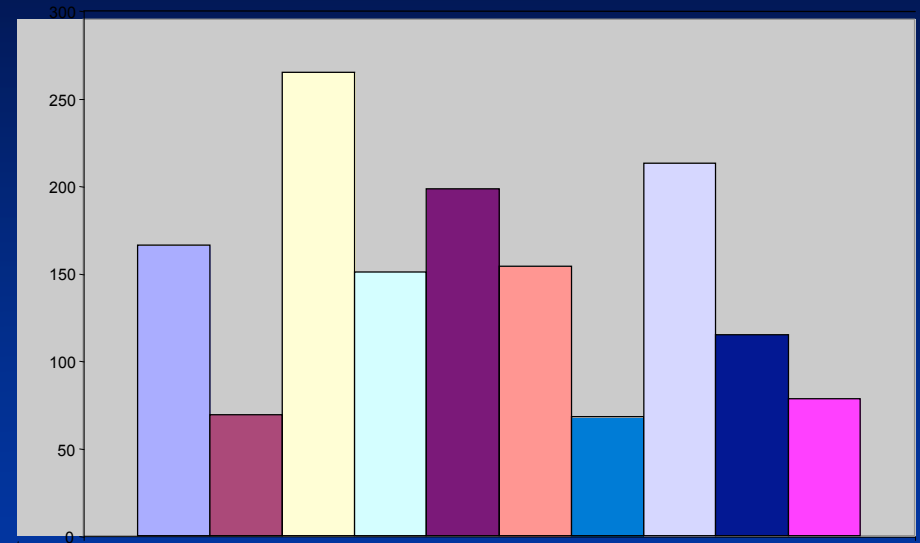


# Site differences

## RMS instability, %



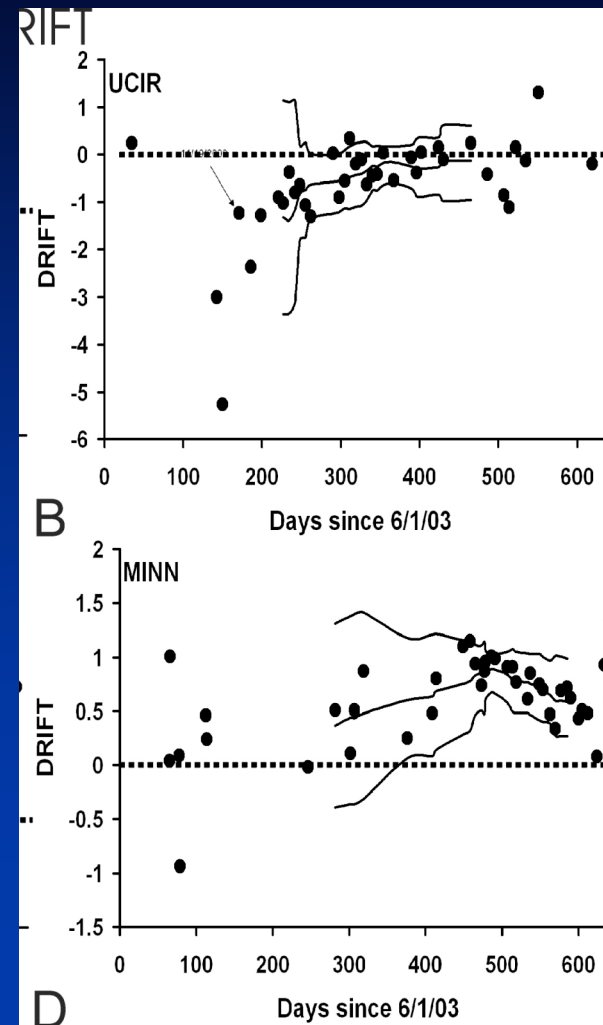
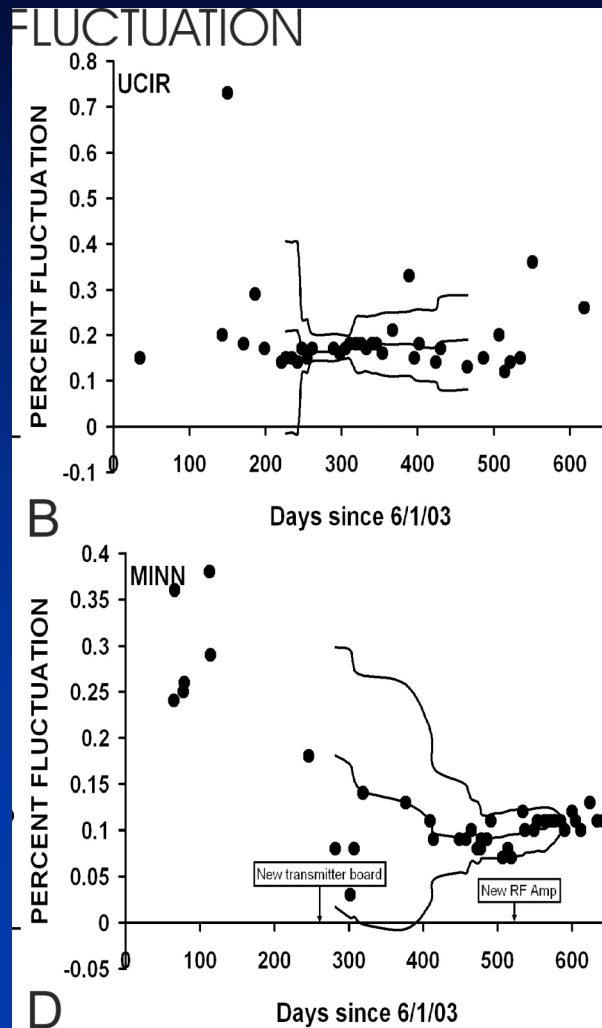
## SFNR



BWH Duke, 1.5T Duke, 4.0T Iowa MGH Minnesota New Mexico Stanford UCI UCSD



# QA helped to bring scanners into spec



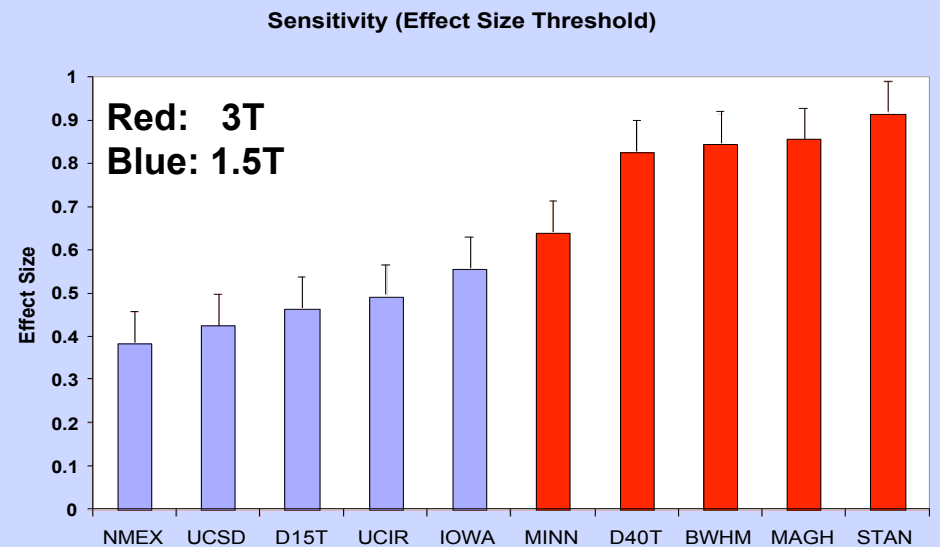
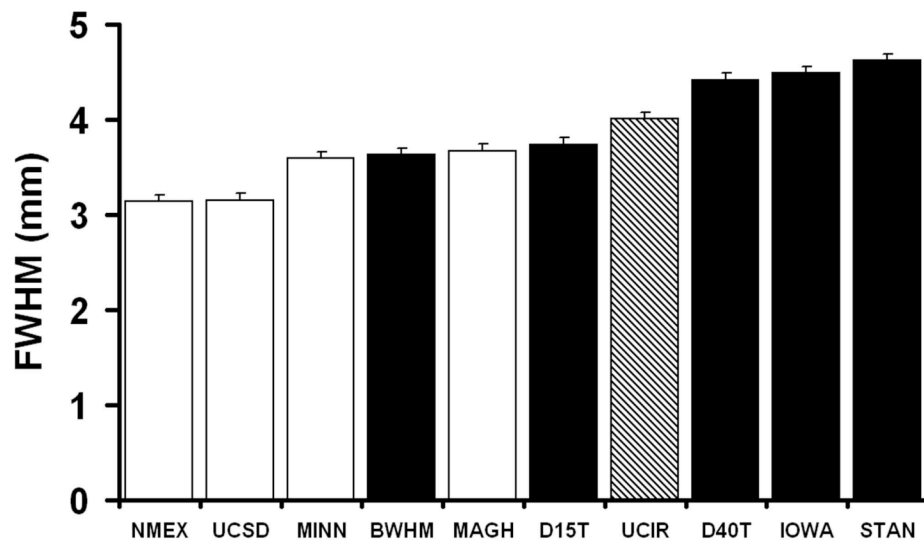
Friedman,  
JMRI 2006

# Issues in multicenter studies

---

- Standardization of protocols
- QA
- **Site Equalization**
  - **smoothness compensation**
  - **SFNR compensation**

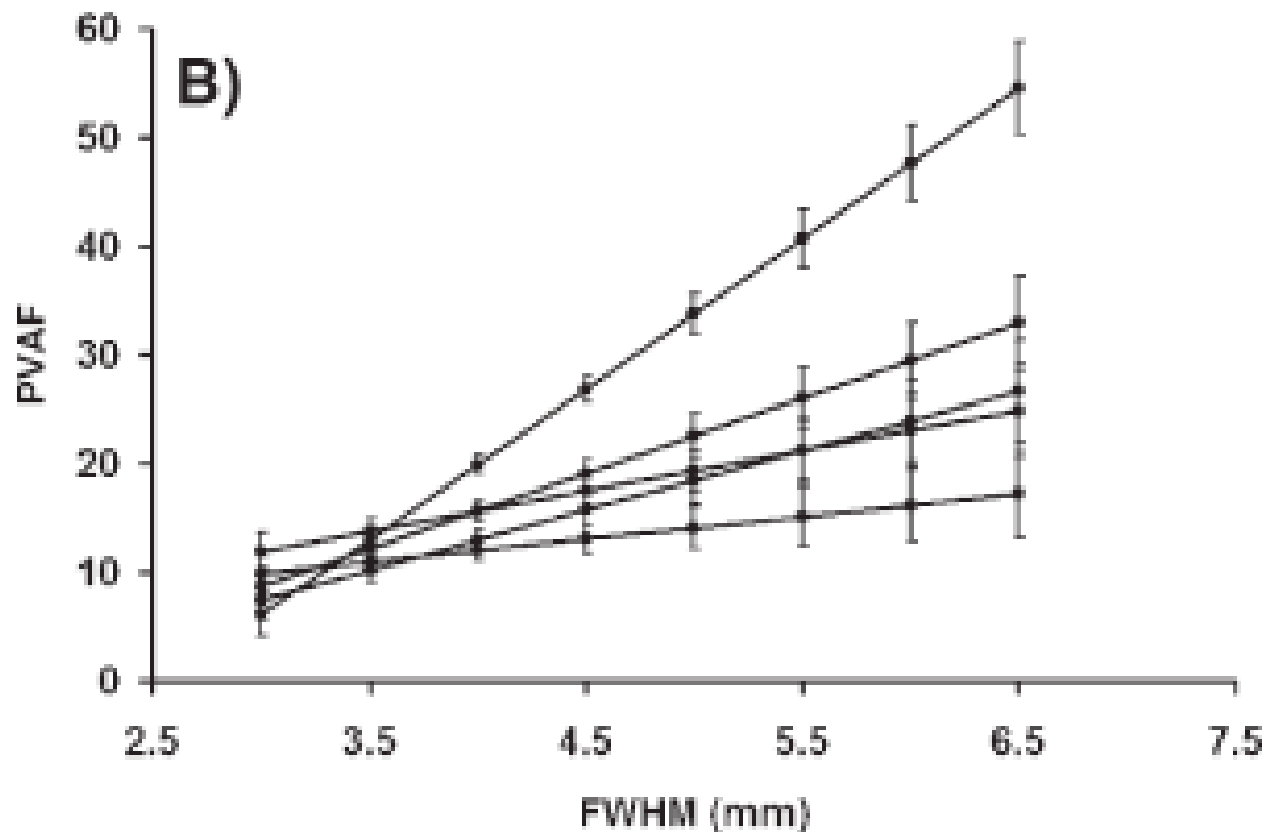
# Smoothness/BOLD Differences





# Sensitivity vs. Smoothness

5 traveling  
subjects at  
10 sites  
performing  
sensorimotor  
task



# Smoothness equalization

---

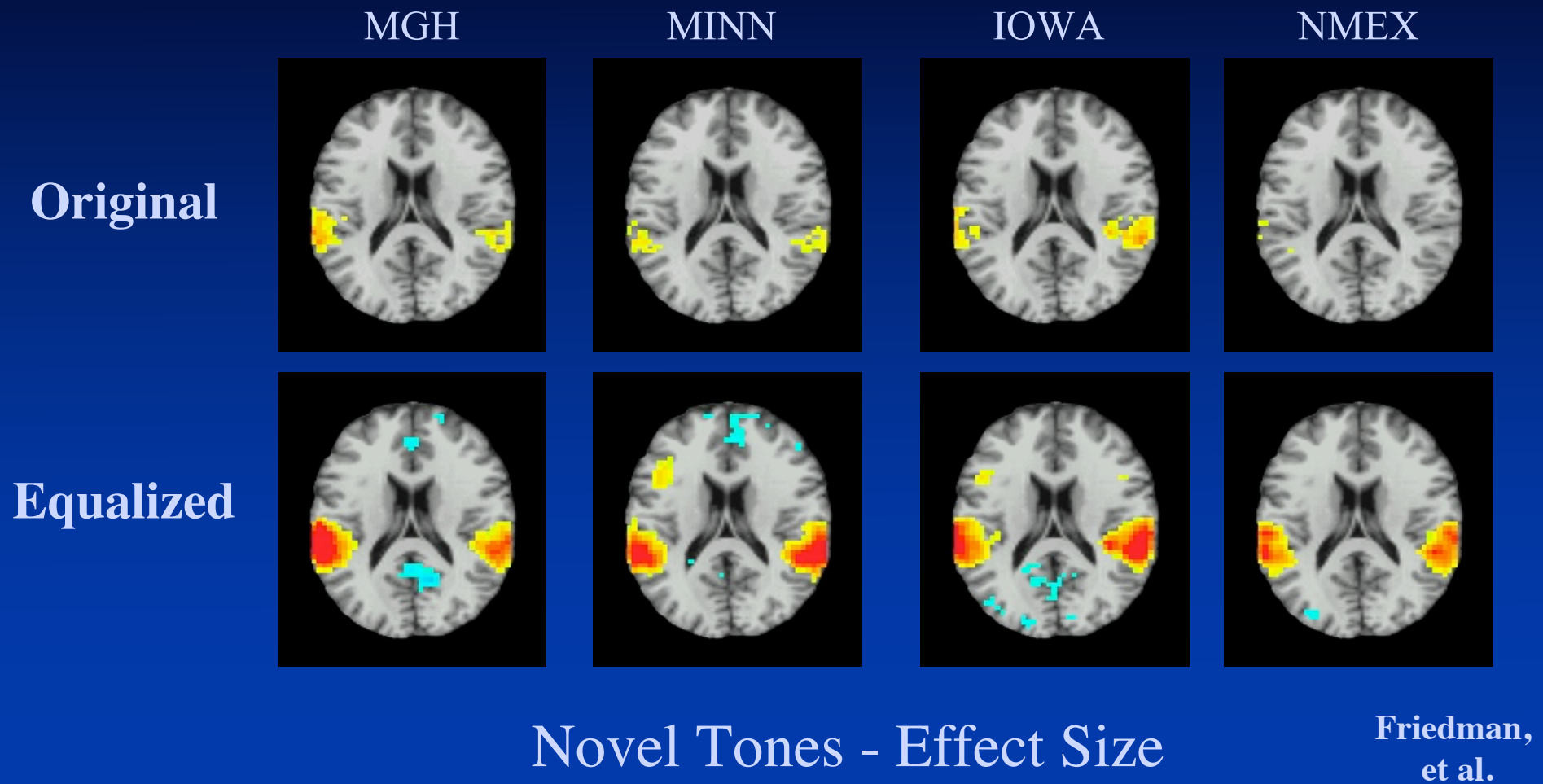
- In first-level analysis: Use “smooth to” instead of “smooth by”
- Smooth each site to largest FWHM using Gaussian filter

$$FWHM_{out}^{-2} = FWHM_{meas}^{-2} + FWHM_{filter}^{-2}$$

e.g., AFNI program (thanks to R. Cox)

# BOLD Sensitivity: Oddball Task

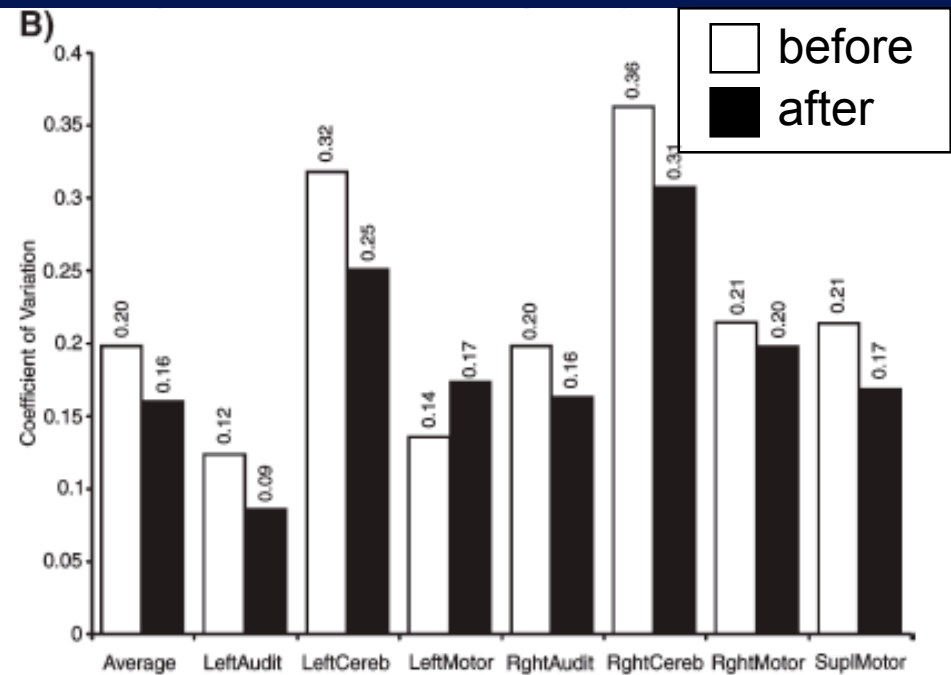
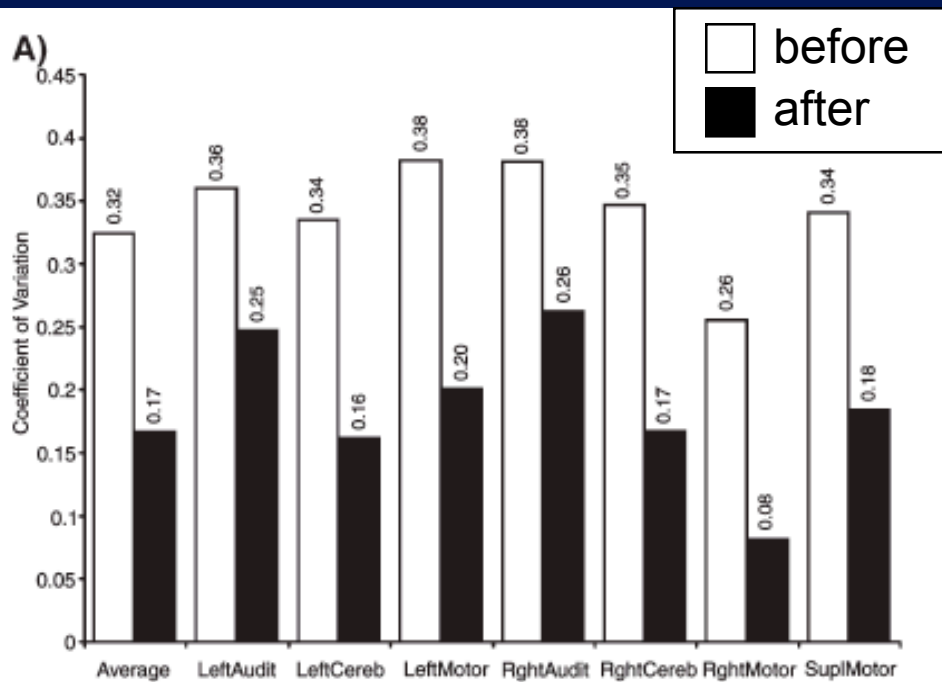
---



# Intersite CV

1.5T

3T



Friedman,  
et al. 2006

# fMRI equalization across sites

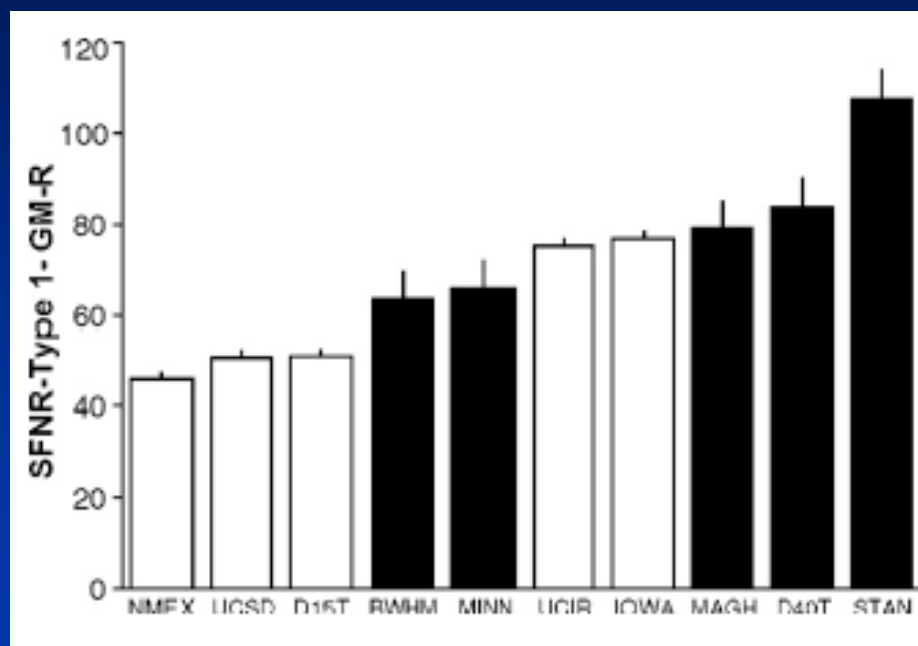
---

- Compensation for smoothness
- **Compensation by SFNR**

# fMRI equalization by SFNR

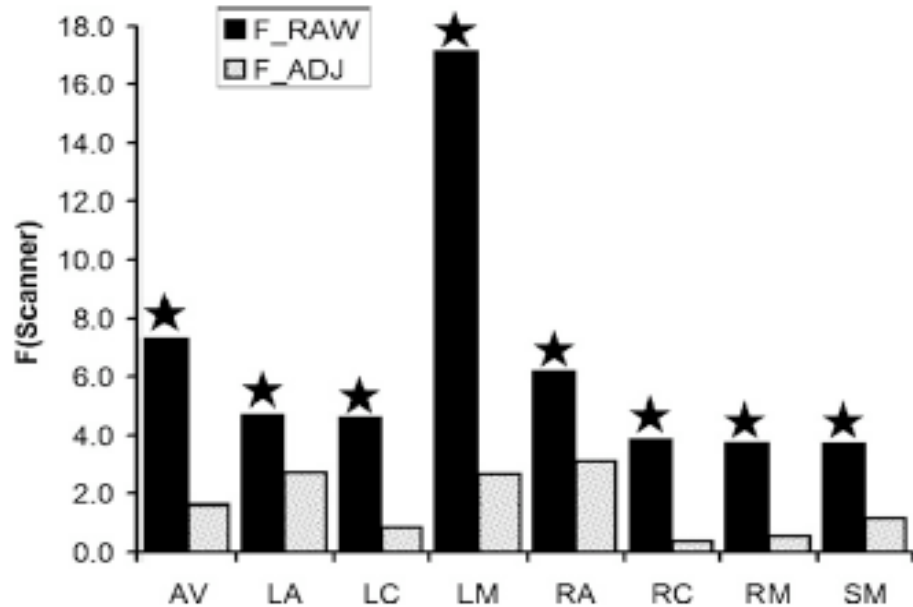
- Measure SFNR using
  - GM - Rest
  - WM - Rest
  - GM - SMresid
  - WM - SMresid
- Covary for SFNR

## Original SFNR

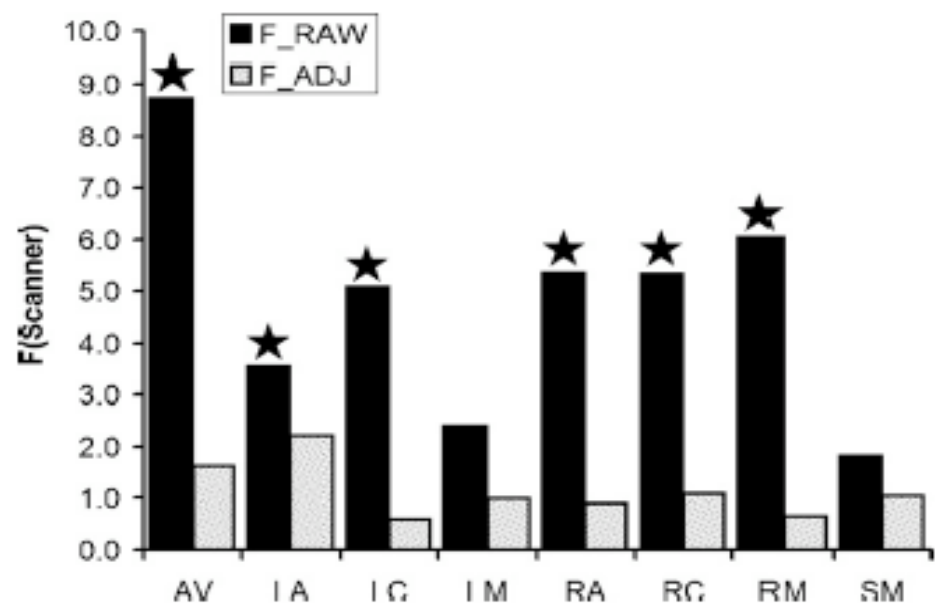


# Site equalization by SFNR

1.5T

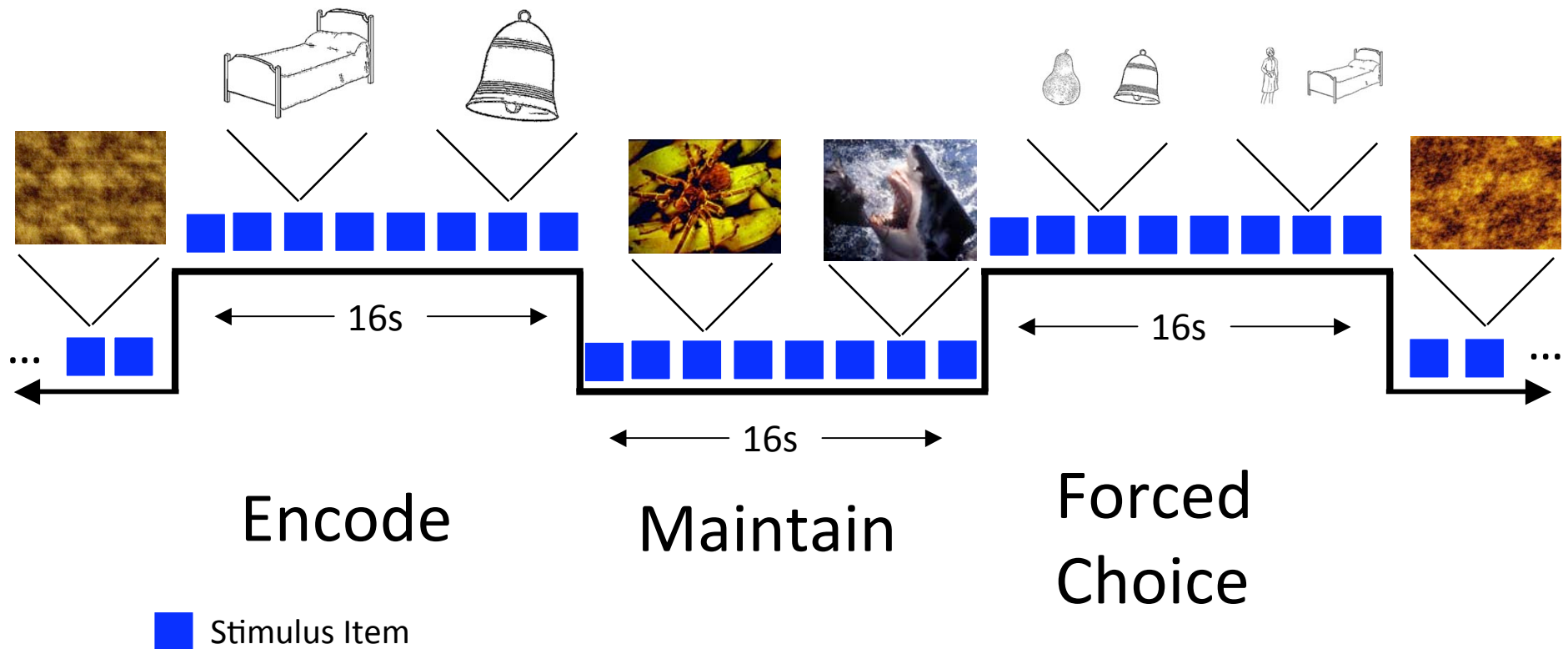


3T





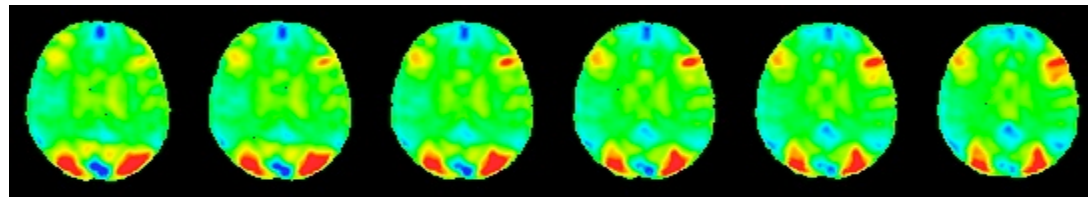
# fBIRN Emotional Working Memory Task: Emotional Distraction



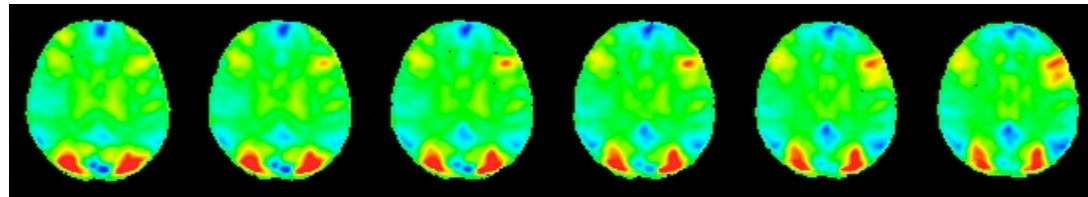
Eight pictures presented during the encode period.

Eight picture pairs presented during the forced choice period.

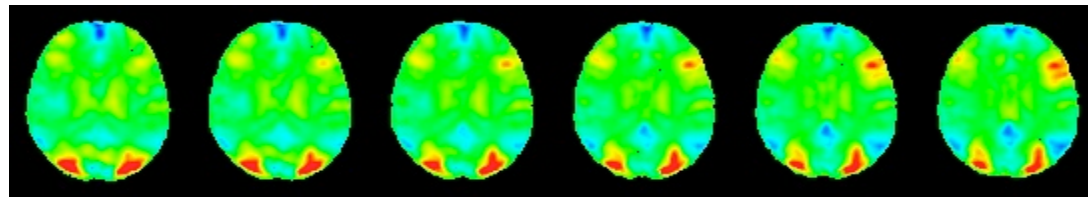
# Mean of Contrast 1 at Four Study Sites



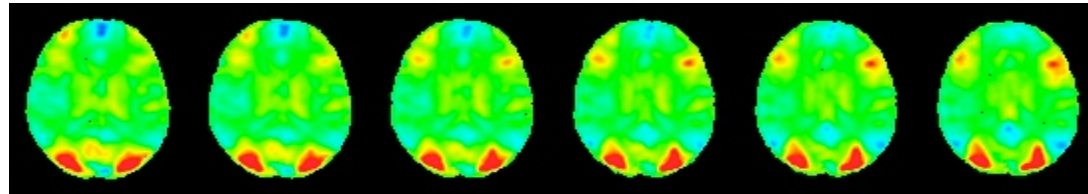
0003



0005



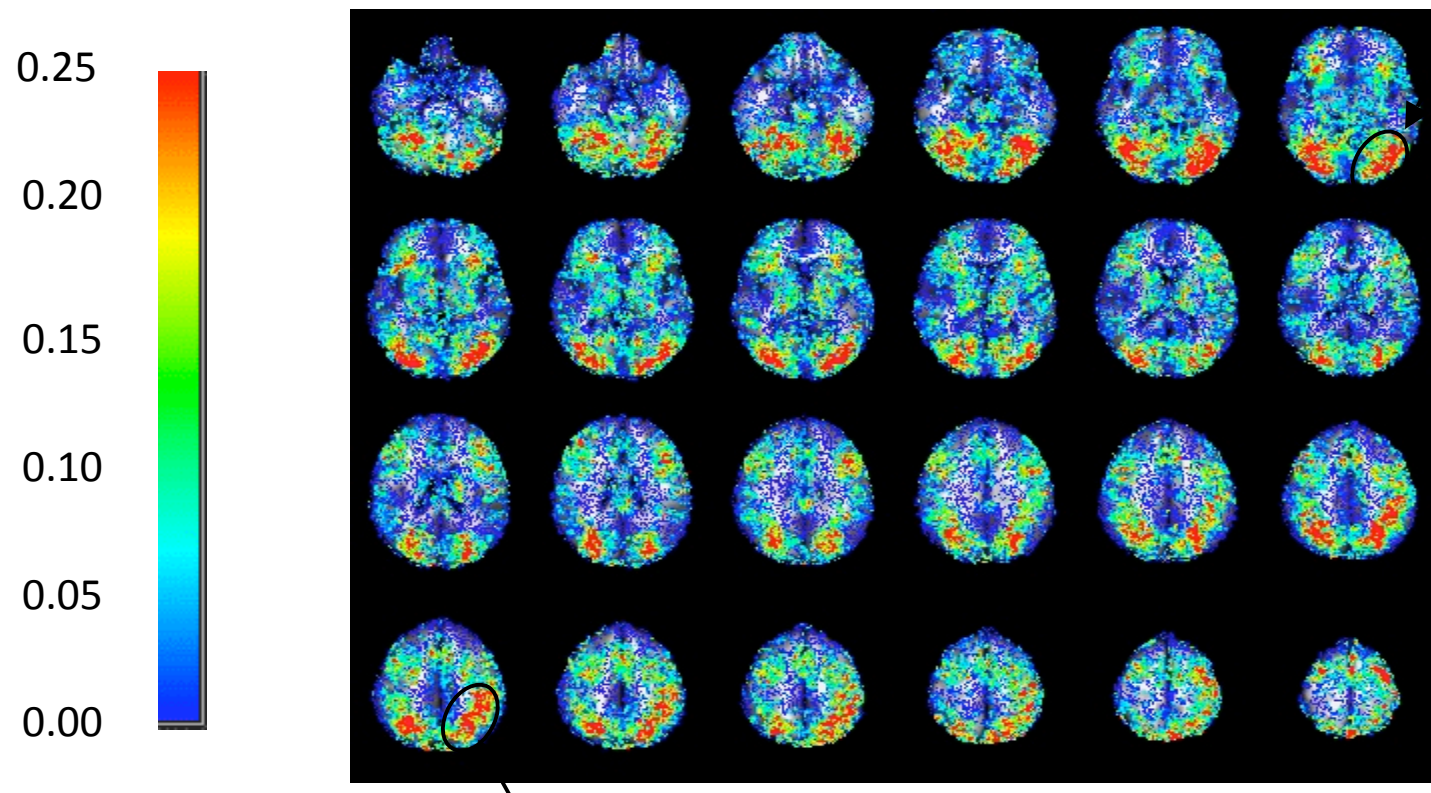
0006



0018

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# ICC Unadjusted Minus ICC w/BH Calib: Site effects



Functional Contrast 1

G. Brown, et al.

# **Multisite Studies- items not discussed**

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- Task design
- Ancillary hardware: projection, sound, button box, physiological, bite bar/stabilization
- Acquisition script
- Data integrity:
  - QA of all scan data
  - automated upload of scan and meta data
  - automated analysis pipeline
- Employ a traveling site coordinator/scannee

# Summary

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**BOLD contrast confounded by**

- **inter-subject, inter-regional variations in hemodynamic response amplitude/latency**
  - **use hypercapnic calibration (e.g. BH) or ASL to reduce vasoreactivity ‘gain factor’ variance**
- **respiratory- and cardiovascular-induced BOLD signal changes**
  - **use RETROICOR and RVHRCOR (must measure card. and resp. functions)**
- **site differences in stability, SNR, pulse sequence, parameters, study administration**

# Summary

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- **Reduction of these confounds can improve confidence in activation maps**
- **Calibration important in group comparisons, longitudinal studies**
- **QA, standardization, calibration crucial in multicenter studies**



# fMRI: Many biomarker applications





# Acknowledgements:

## fBIRN Calibration Working Group

Greg Brown @ucsd.edu

Lee Friedman @gmail.com

Doug Greve @nmr.mgh.harvard.edu

Tom Liu @ucsd.edu

Bryon Mueller @cmrr.umn.edu

Jessie Turner @uci.edu

Jim Vovoyodic @duke.edu

## My kids

Catie Chang

Lara Foland

Jason Hsu

Christine Law

David Ress

Moriah Thomason

Caires



National Center for  
Research Resources

*NIH: National Center for Research Resources*

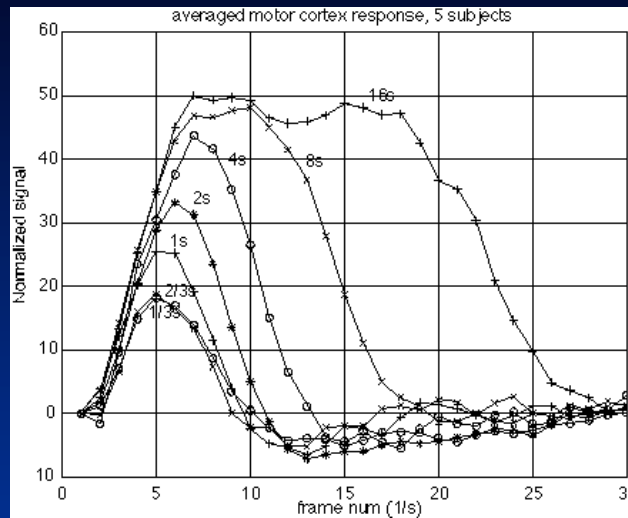
*P41-RR009784*

*U24-RR021992*

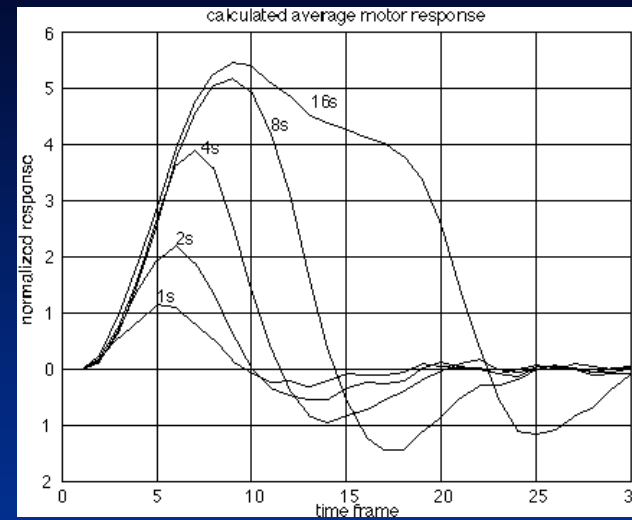
Firenza

# Nonlinearities- Motor

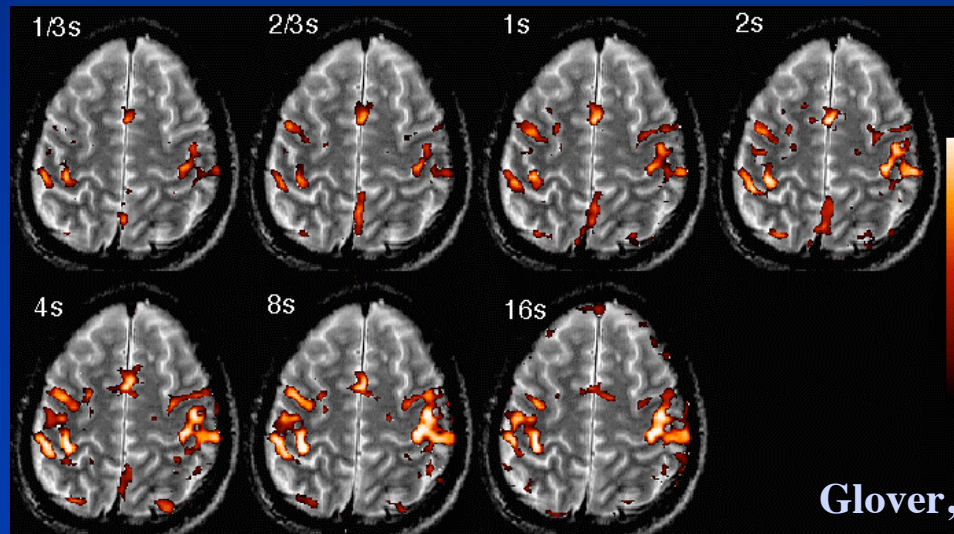
Measured- average of 5 subjects



Calculated using  $h(t) * \text{rect}(T)$



Finger tapping at  
3Hz: 1/3s, 2/3s, 1s,  
2s, 4s, 8s, 16s



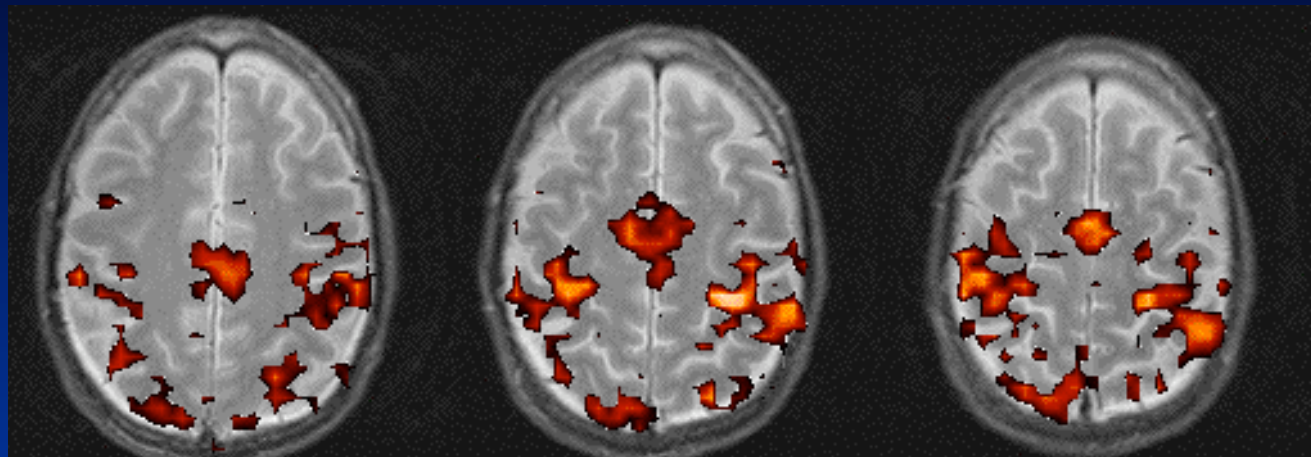
Glover, NeuroImage 9:416 (1999)



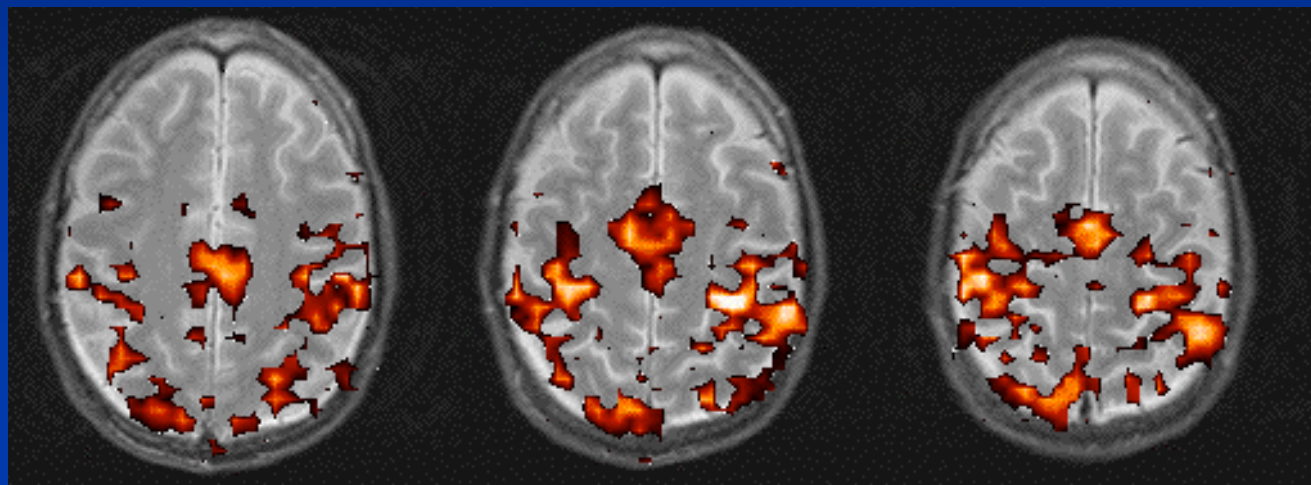
# Effect of HRF on Activation

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Linear HRF



Nonlinear HRF



# BH Calibration Method

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- Use BH task (non-neuronal, no change in CMRO<sub>2</sub>) to normalize cognitive task
- Reduces signal change related to vasoreactivity
- Should reduce inter-subject variance