

# What fMRI Can, Can't, and Might Do

Peter A. Bandettini, Ph.D.

Section on Functional Imaging Methods

<http://fim.nimh.nih.gov>

Laboratory of Brain and Cognition

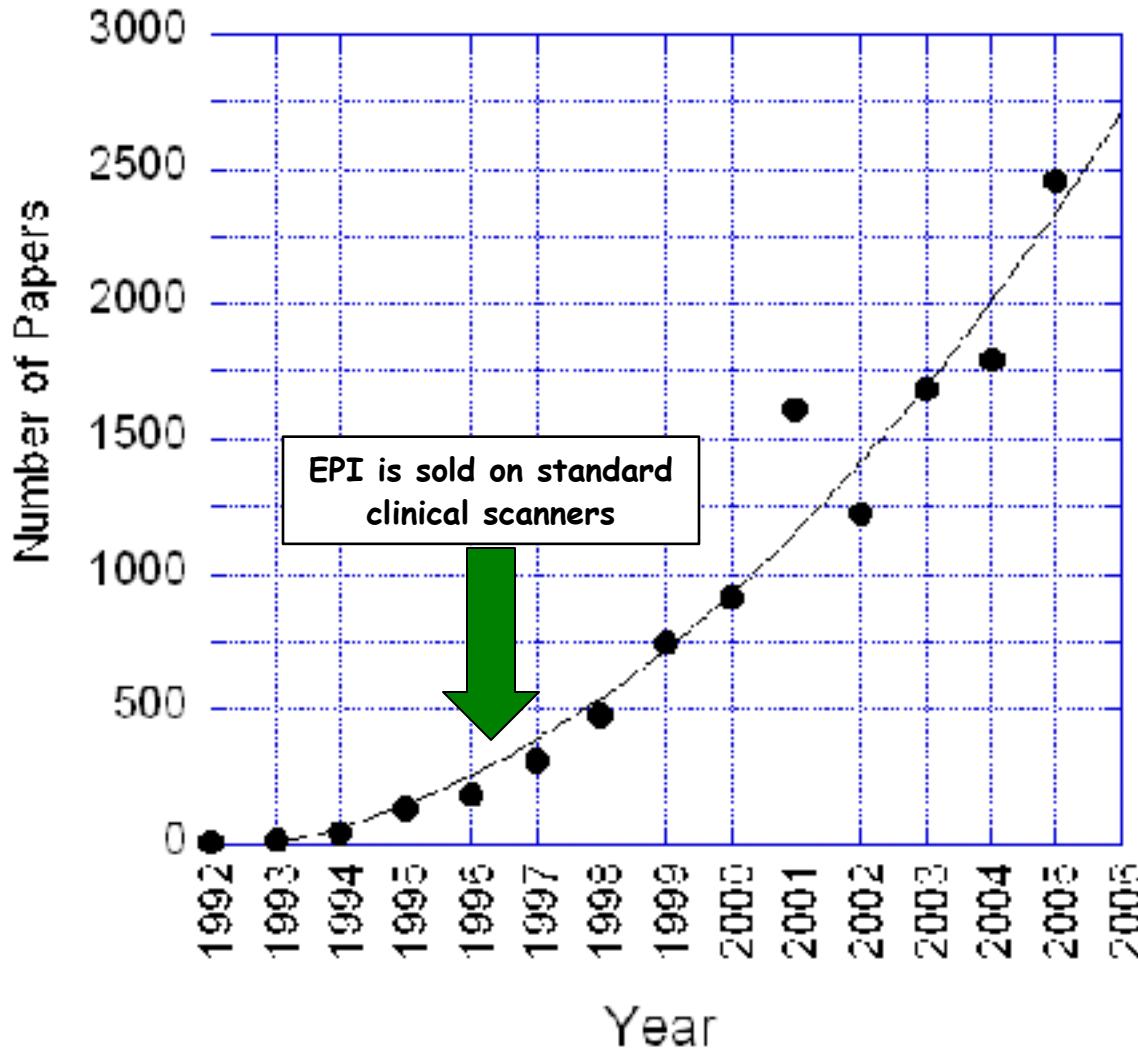
&

Functional MRI Facility

<http://fmrif.nimh.nih.gov>

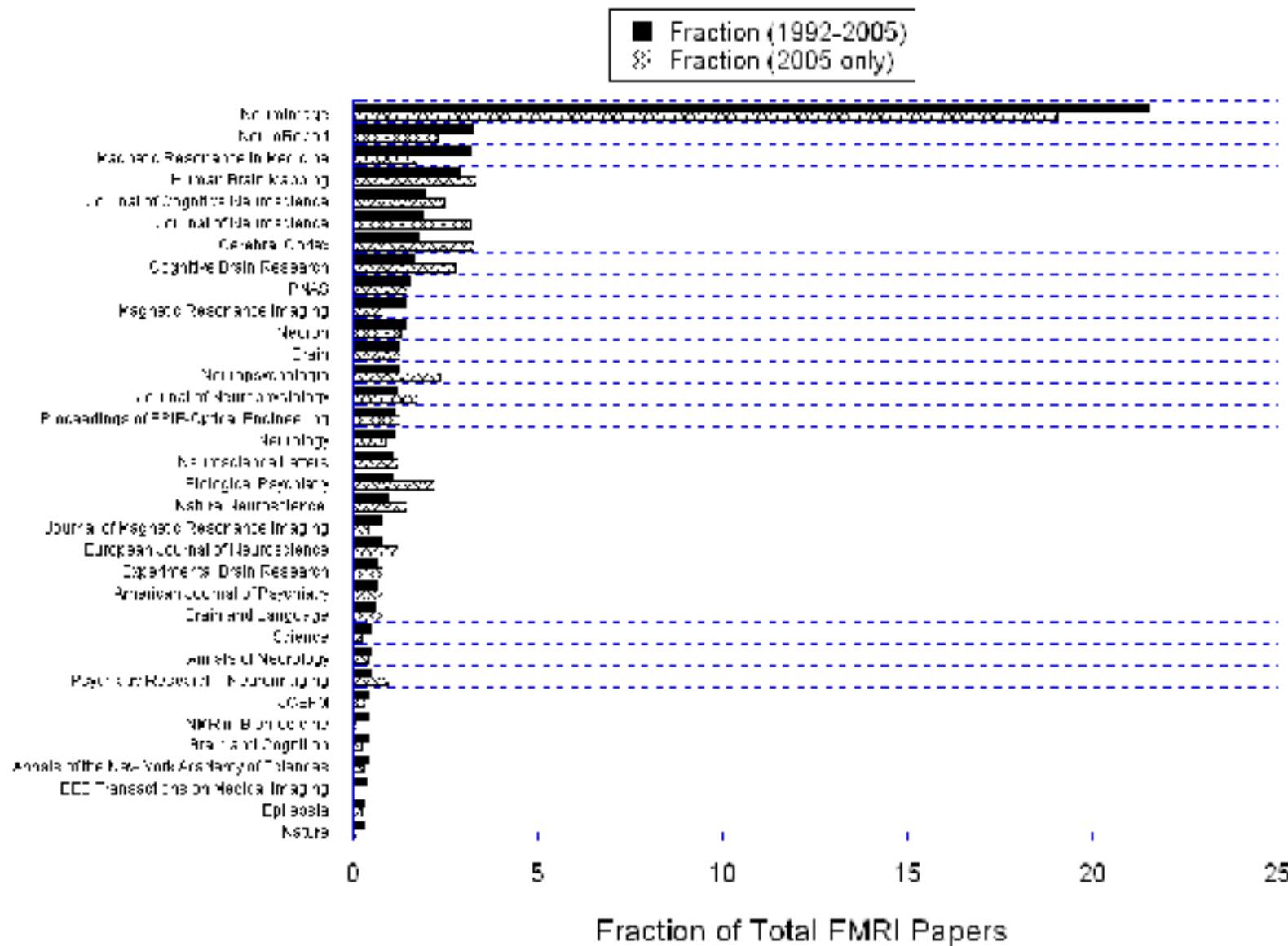


# fMRI Papers Published per Year

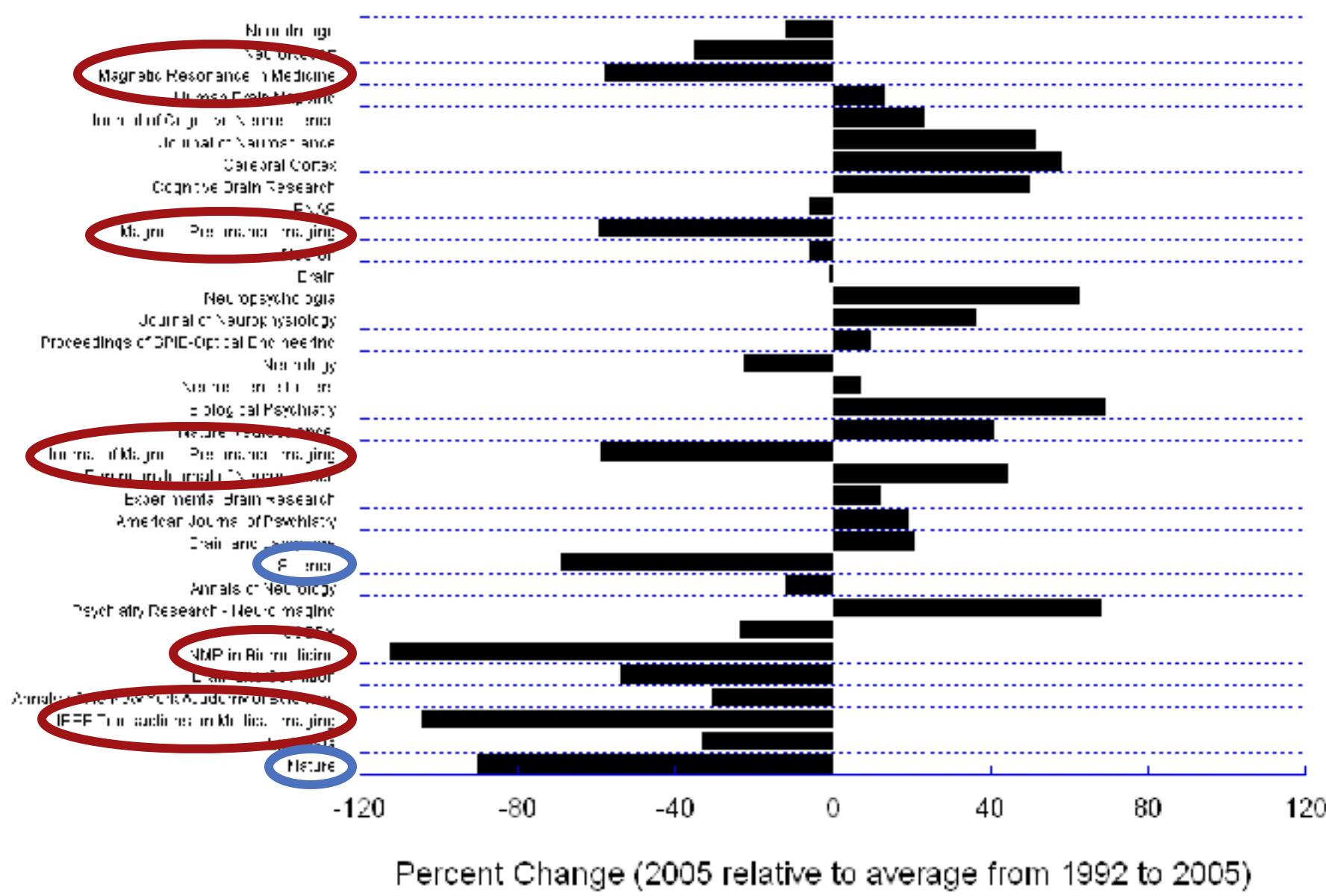


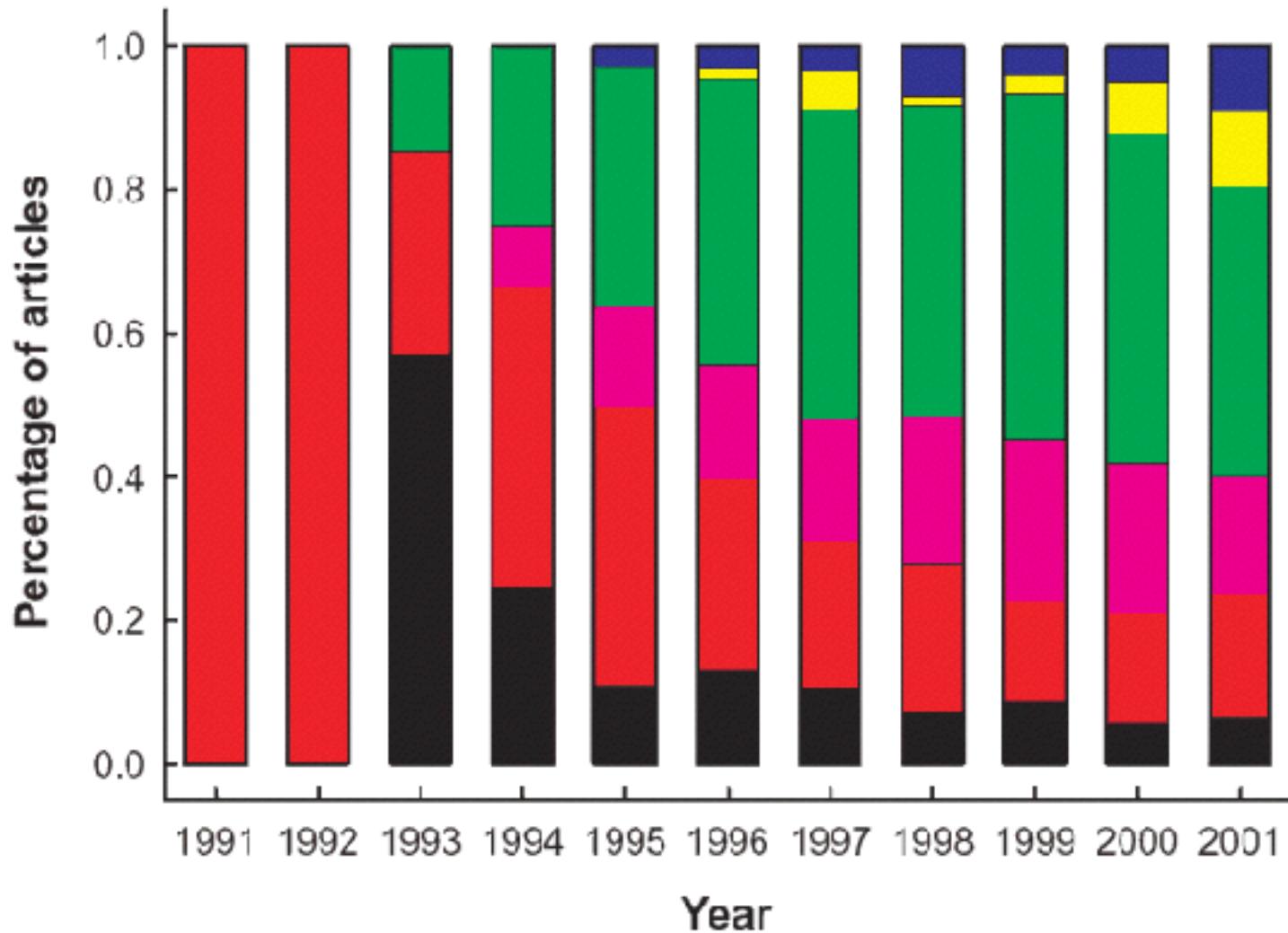
“fMRI” or “functional MRI”

# Breakdown of fMRI papers by Journal



Percent Change in fMRI Publications of 2005 relative to Average (1992 - 2006) for Each Journal





Motor (black)  
Primary Sensory (red)  
Integrative Sensory (violet)  
Basic Cognition (green)  
High-Order Cognition (yellow)  
Emotion (blue)

J. Illes, M. P. Kirschen, J. D. E. Gabrielli, Nature Neuroscience, 6 (3)m p.205

# How most fMRI studies are performed

## MRI parameters:

1.5T - 3T, 64 × 64 matrix, 3mm × 3mm × 5mm voxel size,  
whole brain, TR = 2 sec.

## Paradigm:

Block design or event-related, single or multiple conditions.

## Analysis:

Motion correct, multi-regression, spatial smoothing and spatial normalization, standard classical statistical tests, multi-subject averaging.

## Hypothesis:

A region or network of regions show modulation with a task. This modulation is unique to the task and/or population.

# How fMRI might be performed

## MRI parameters:

3T - 11.7T,  $256 \times 256$  matrix,  $0.5 \times 0.5 \times 0.5$  voxel size,  
whole brain TR = 1sec or select slab TR = 100 ms.

## Paradigm:

Natural, continuous, or no stimuli/task. Simultaneous multi-modal, or multiple contrast measurements.

## Analysis:

Motion correct, dynamic Bo-field correction, no spatial or temporal smoothing, machine learning algorithms, pattern classification, hemodynamic parameter assessment, correlation with behavior.

## Hypothesis:

Similar to previous but using the high resolution patterns, fluctuations, dynamics, and contrast mechanisms that we are still figuring out how to interpret and extract.

# Technology

Coil arrays  
High field strength  
High resolution  
Novel functional contrast

# Methodology

Connectivity assessment  
Multi-modal integration  
Pattern classification  
Task design

Fluctuations  
Dynamics  
Cross - modal comparison

Basic Neuroscience  
Behavior correlation/prediction  
Pathology correlation

# Interpretation

# Applications

# Technology

Coil arrays  
High field strength  
High resolution  
Novel functional contrast

# Methodology

Connectivity assessment  
Multi-modal integration  
Pattern classification  
Task design

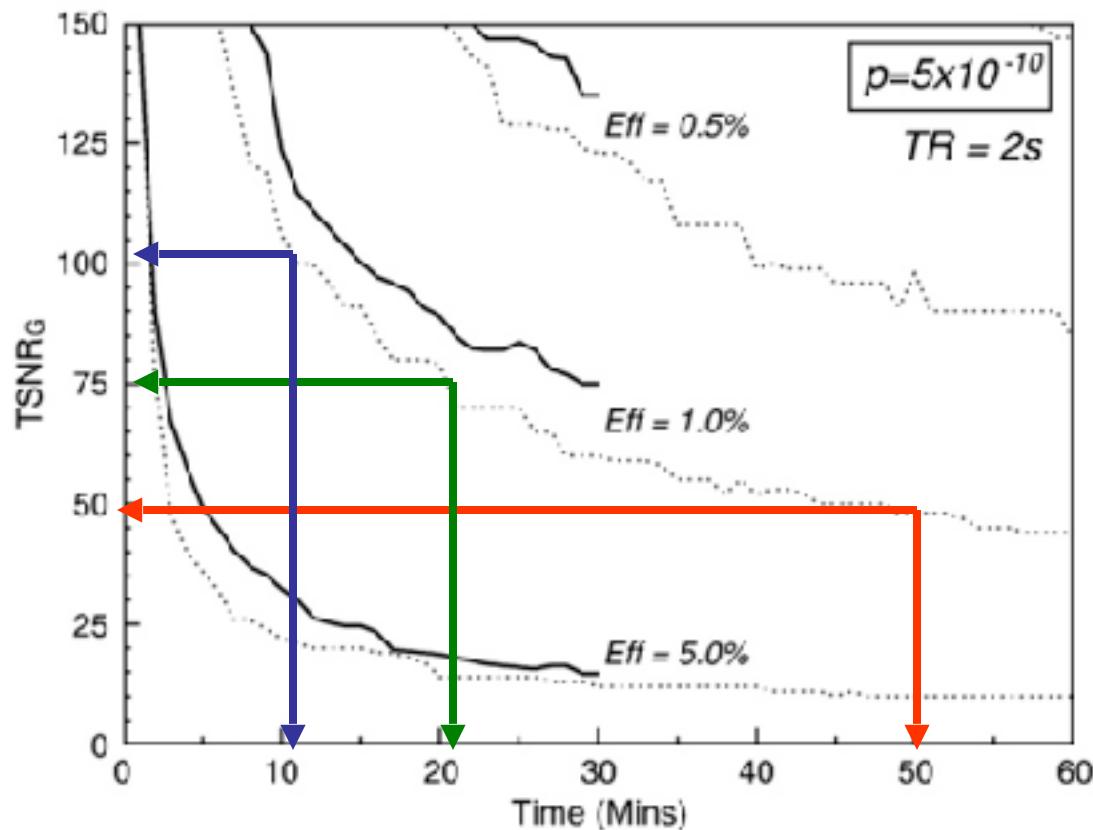
Fluctuations  
Dynamics  
Cross - modal comparison

Basic Neuroscience  
Behavior correlation/prediction  
Pathology correlation

# Interpretation

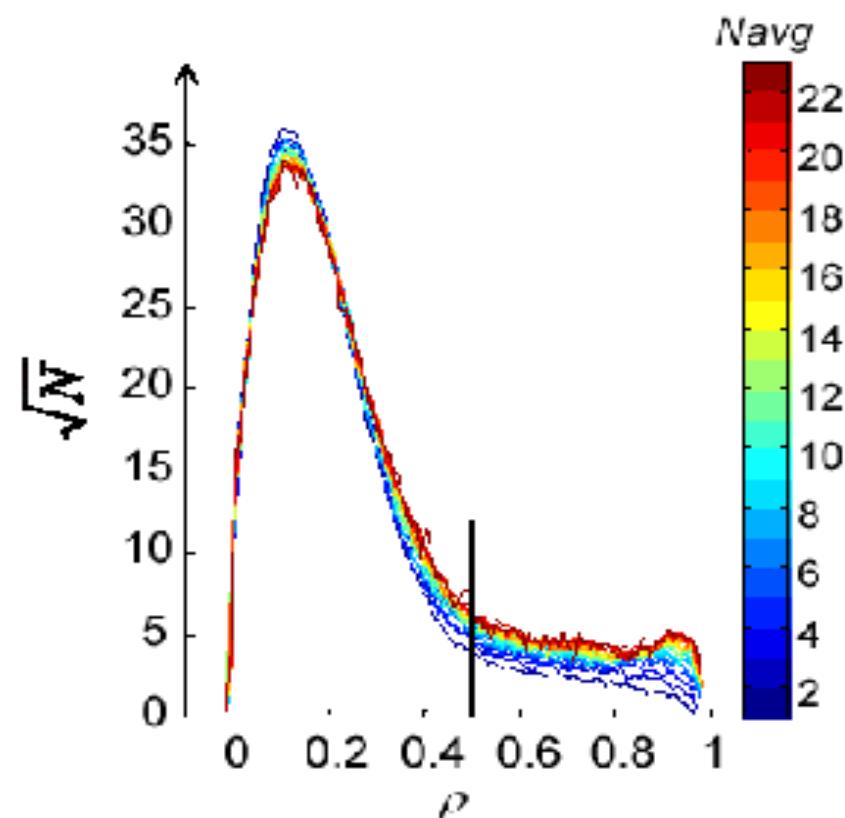
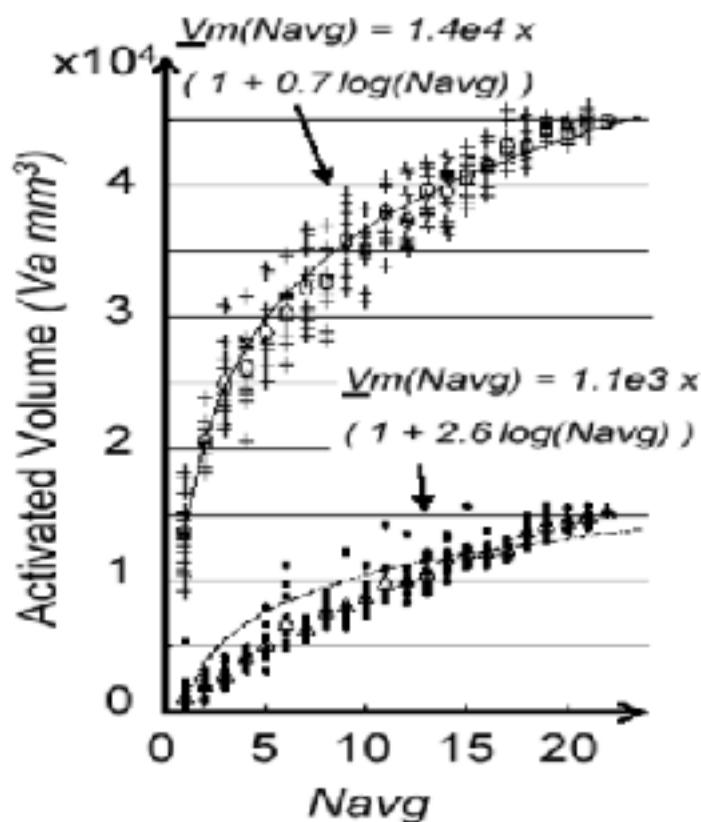
# Applications

# Time series improvement

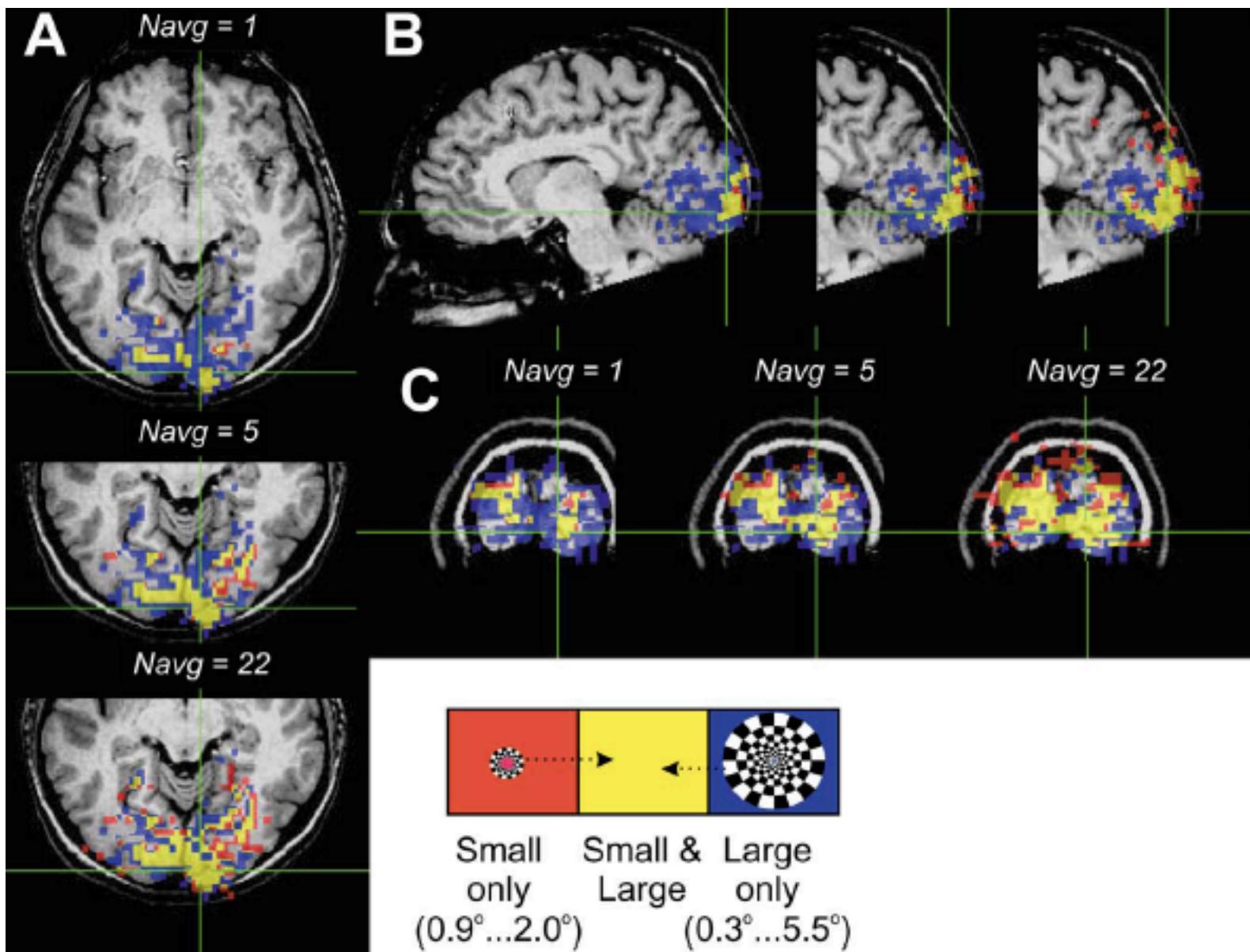


K. Murphy, J. Bodurka, P. A. Bandettini, How long to scan?  
The relationship between fMRI temporal signal to noise and the  
necessary scan duration. NeuroImage, 34, 565-574 (2007)

# Technology



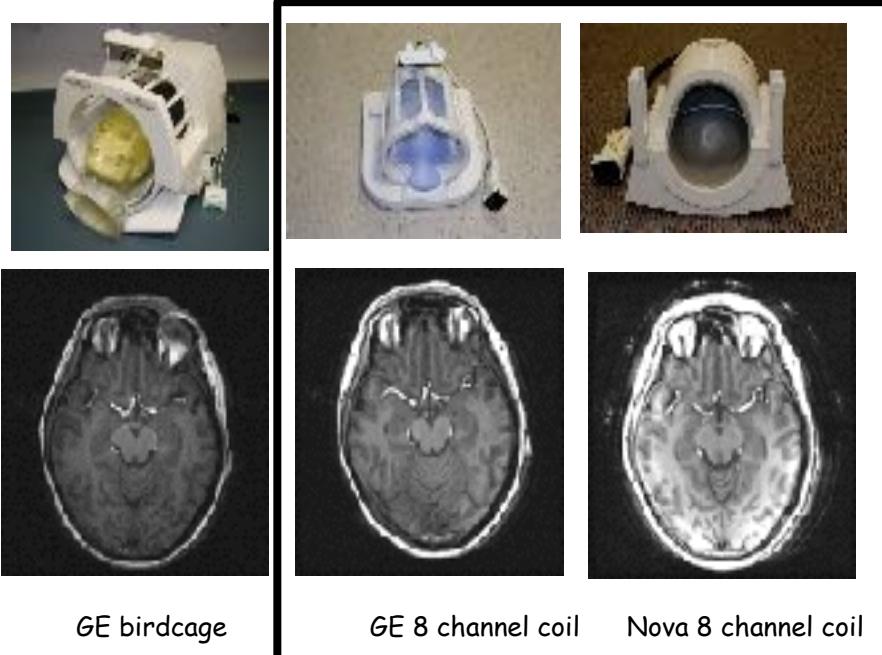
Z. S. Saad, K. M. Ropella, E. A. DeYoe, P. A. Bandettini, The spatial extent of the BOLD response. NeuroImage, 19: 132-144, (2003)



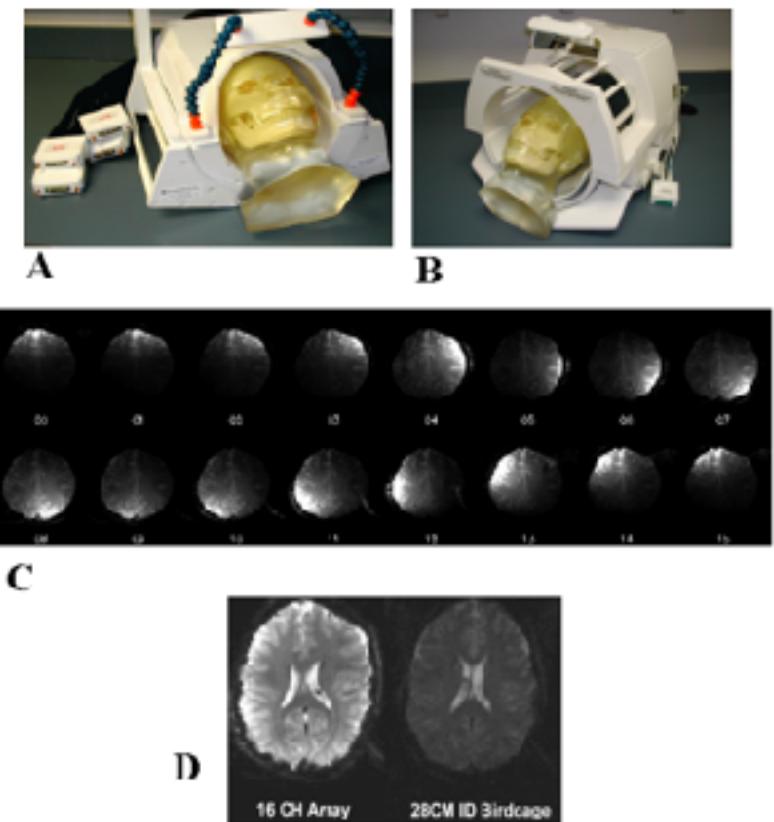
Z. S. Saad, K. M. Ropella, E. A. DeYoe, P. A. Bandettini, The spatial extent of the BOLD response. NeuroImage, 19: 132-144, (2003)

# Technology

8 channel parallel receiver coil

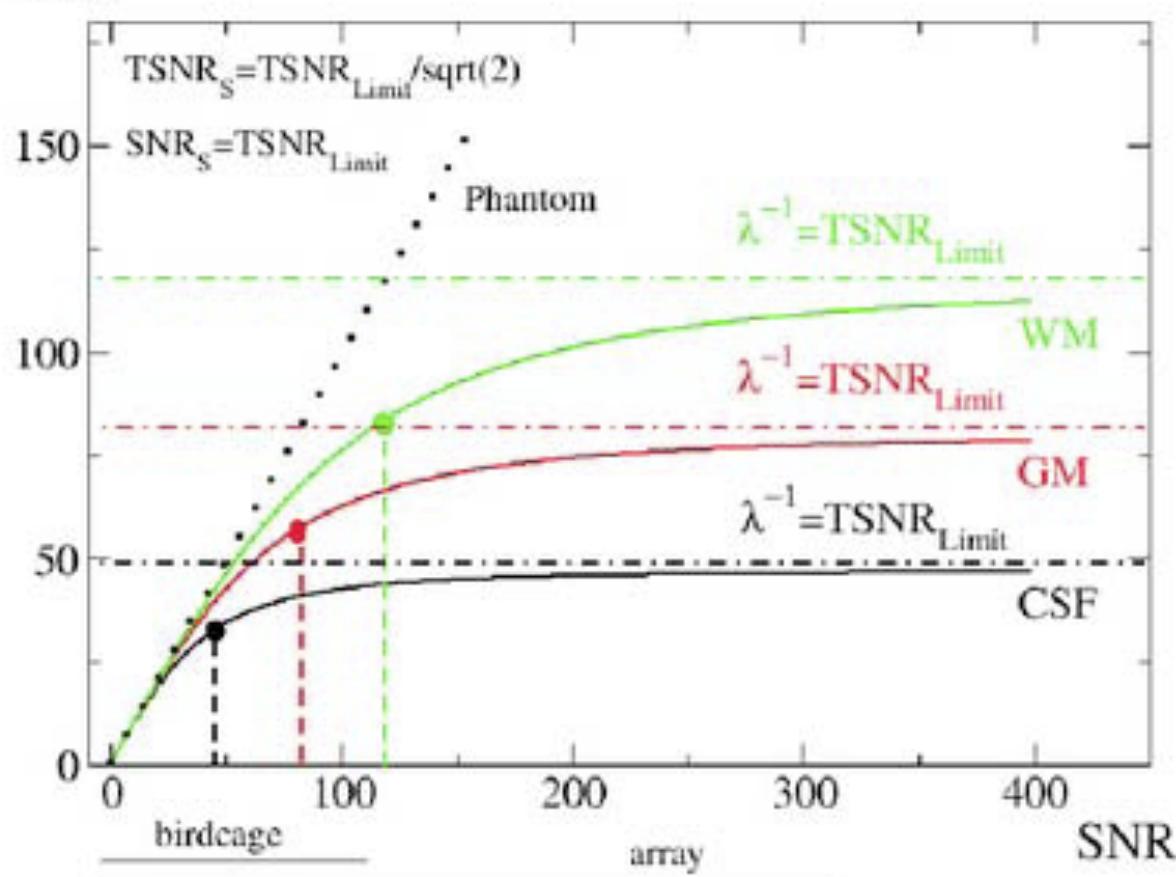


16 channel parallel receiver coil



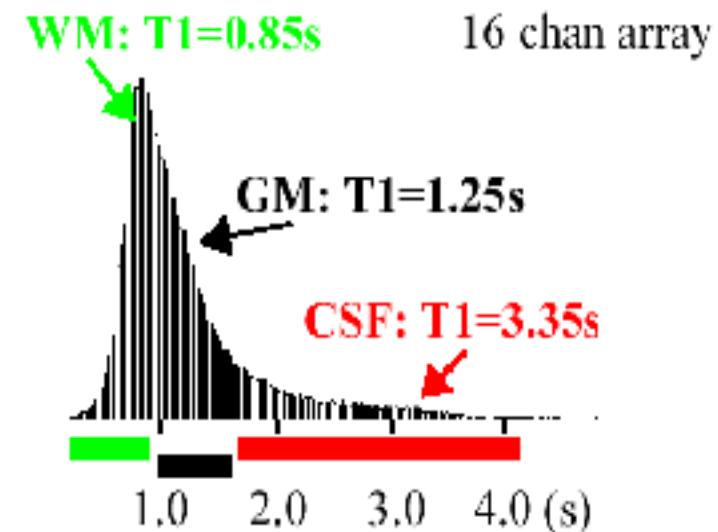
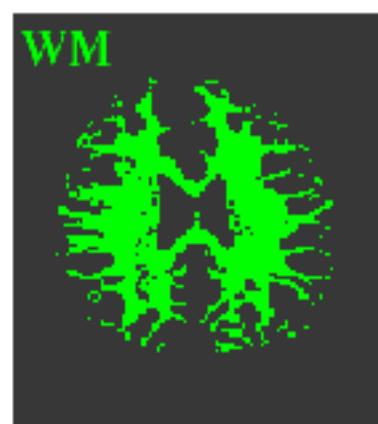
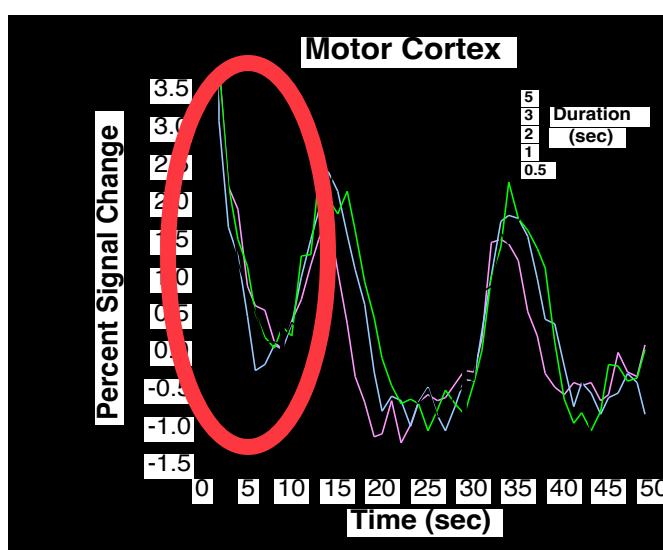
# SNR vs TSNR

TSNR



J. Bodurka, F. Ye, N Petridou, P. A. Bandettini, Mapping the MRI voxel volume in which thermal noise matches physiological noise - implications for fMRI. NeuroImage, 34, 542-549 (2007)

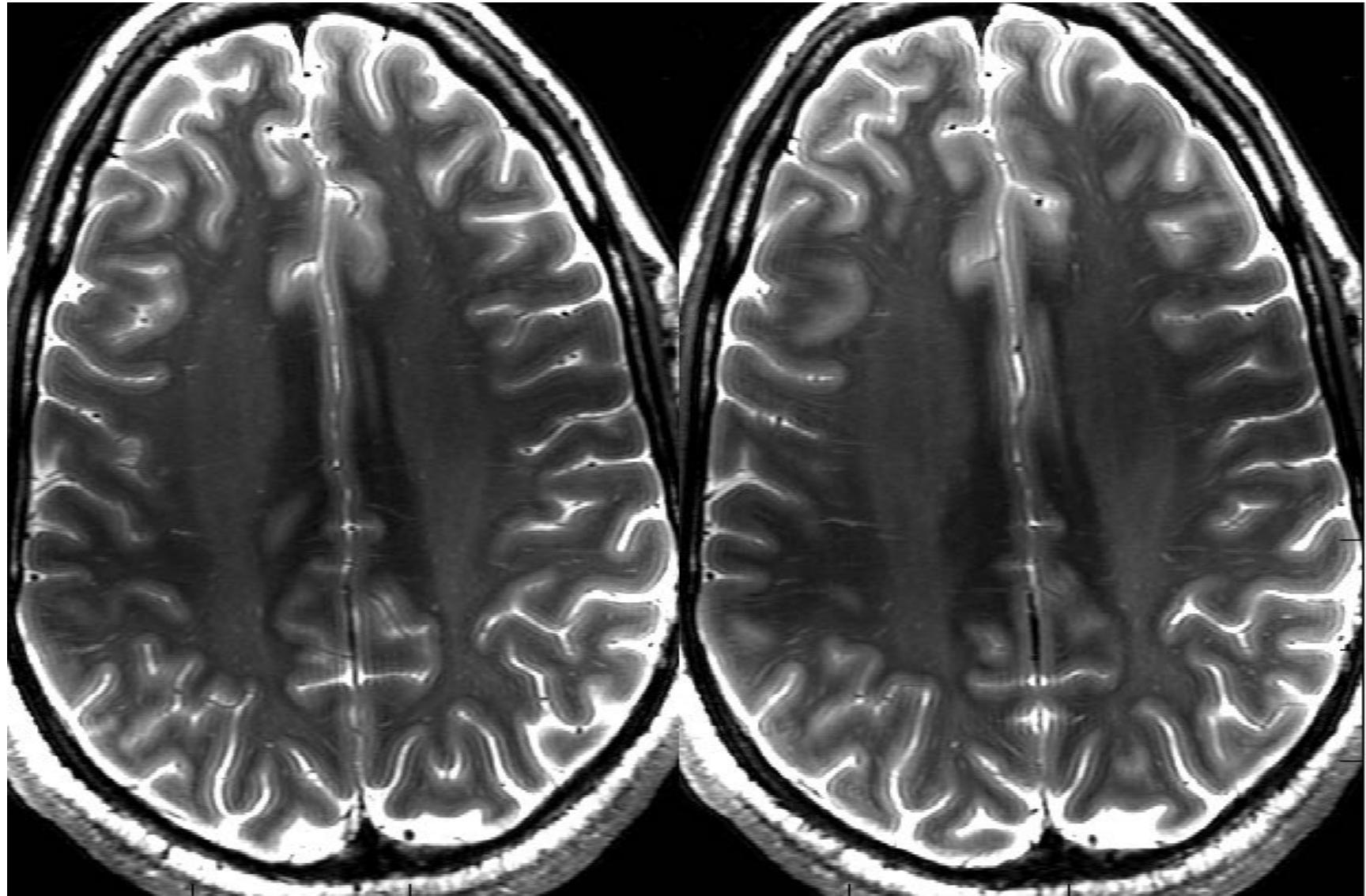
## Segmentation using EPI Transient



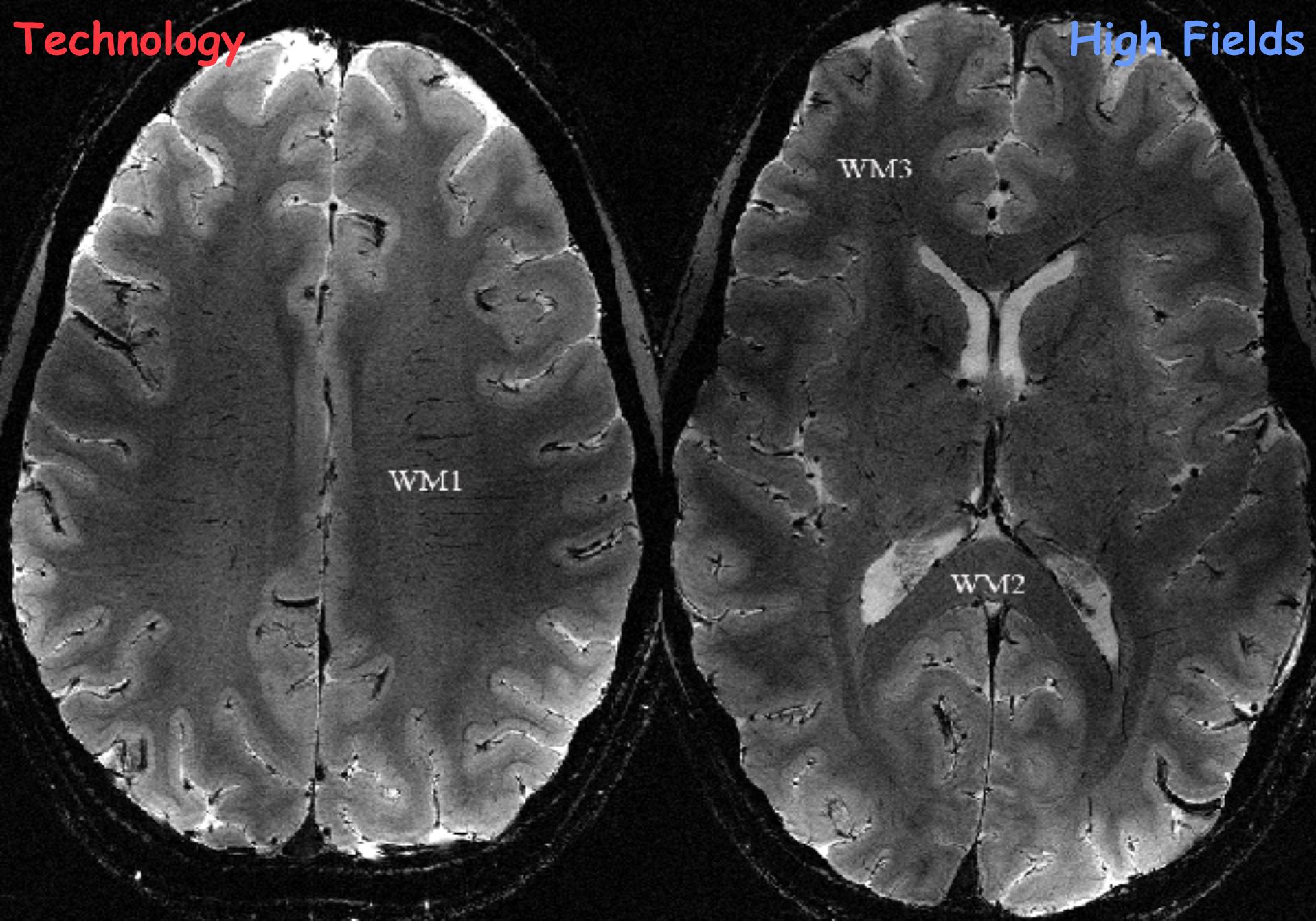
J. Bodurka, F. Ye, N Petridou, P. A. Bandettini, Mapping the MRI voxel volume in which thermal noise matches physiological noise - implications for fMRI. *NeuroImage*, 34, 542-549 (2007)

Technology

High Fields

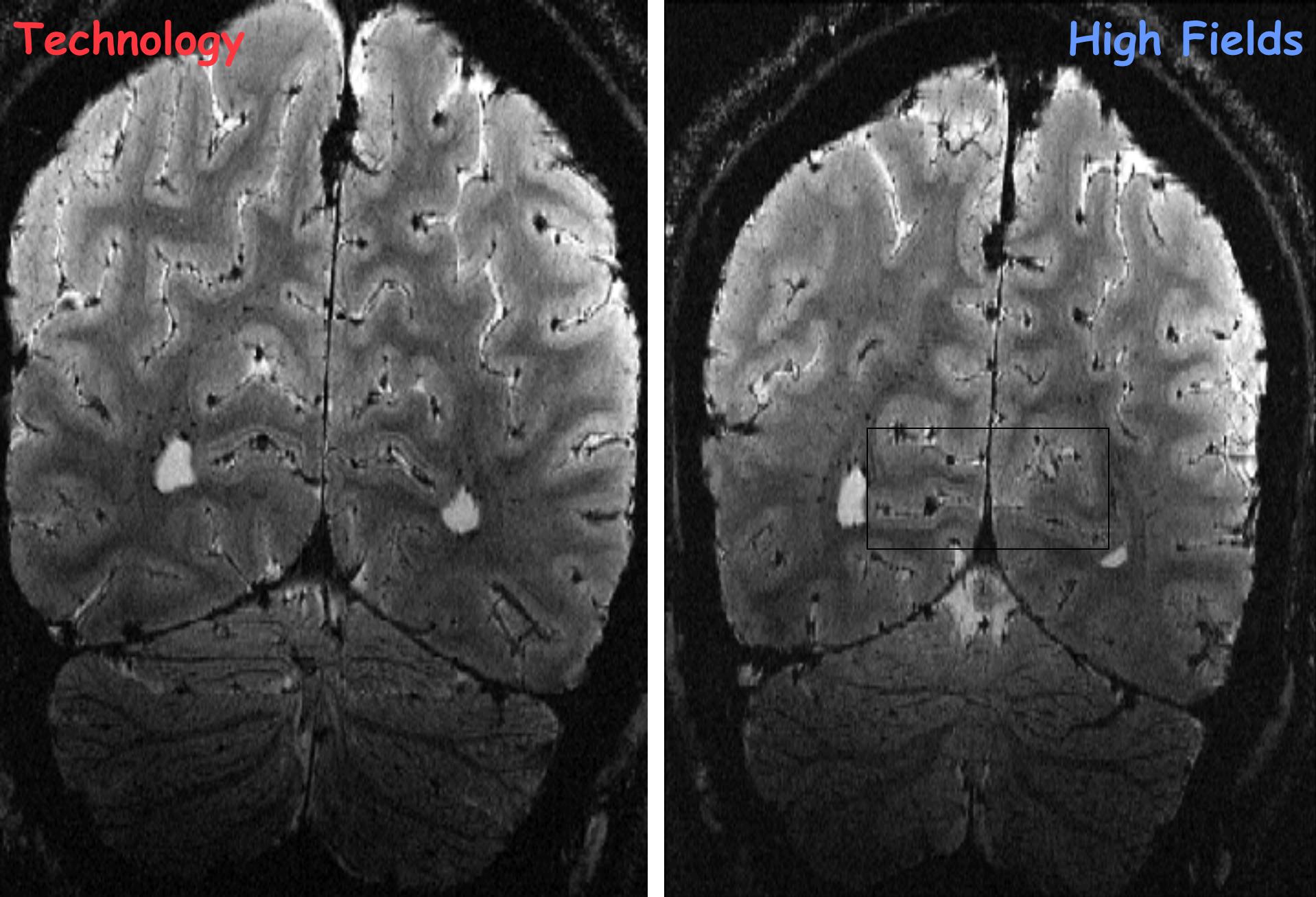


FSE images at  $0.2 \times 2 \times 1 \text{ mm}^3$



Technology

High Fields



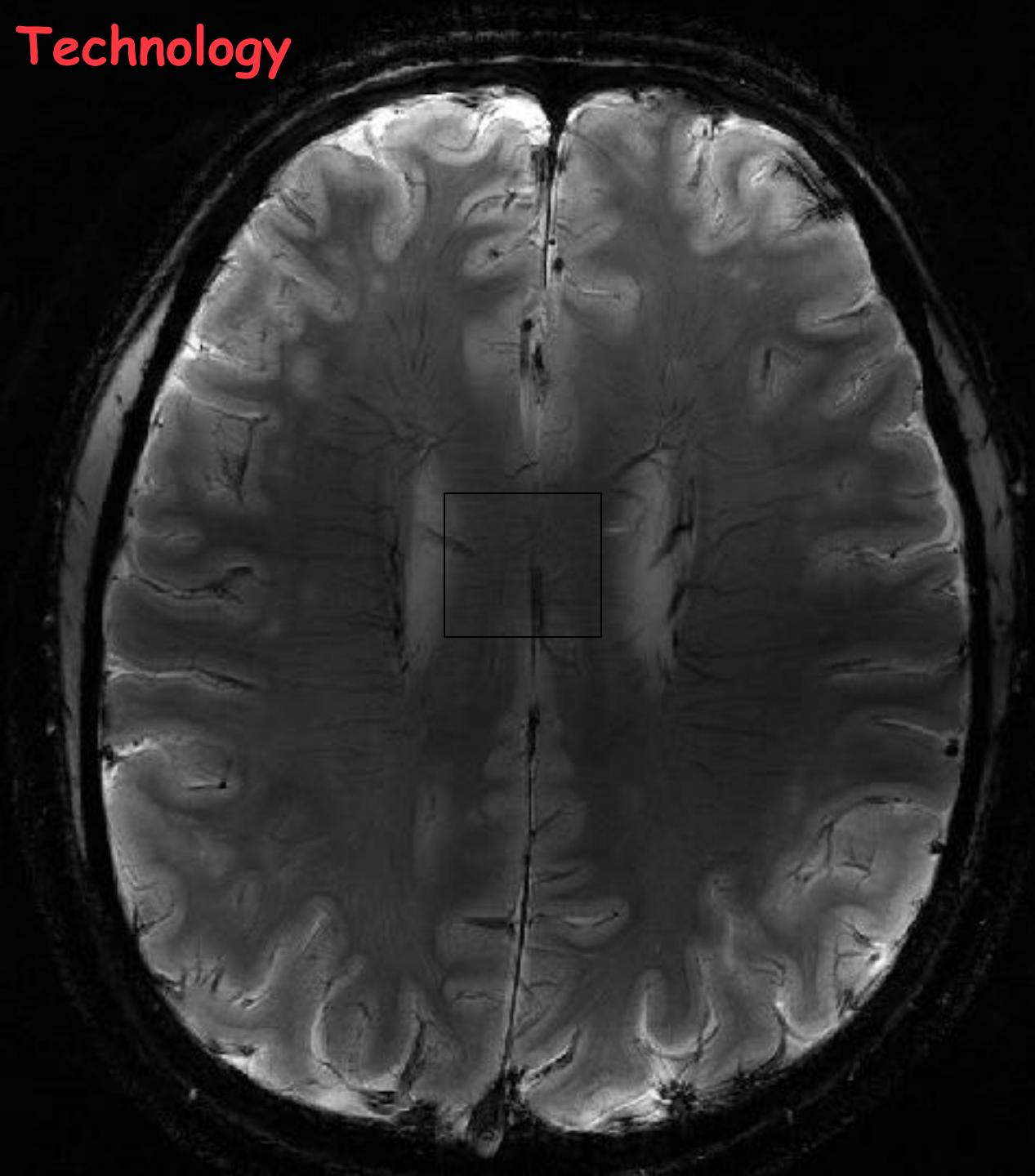
Technology

High Fields



**Layered structure in  
the visual cortex**

# Technology



fiber bundles?

Courtesy Tie-Qiang  
Li, NINDS

# fMRI Contrast

- Volume (gadolinium)
- BOLD
- Perfusion (ASL)
- $\Delta\text{CMRO}_2$
- $\Delta$ Volume (VASO)
- Neuronal Currents
- Diffusion coefficient
- Temperature

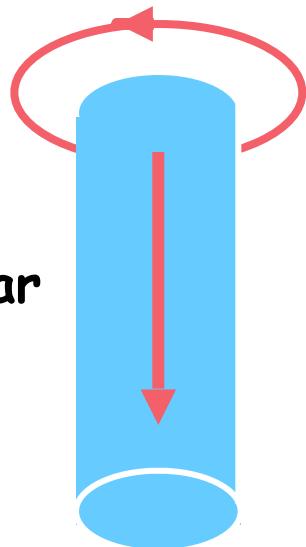
# Technology

# New Contrasts

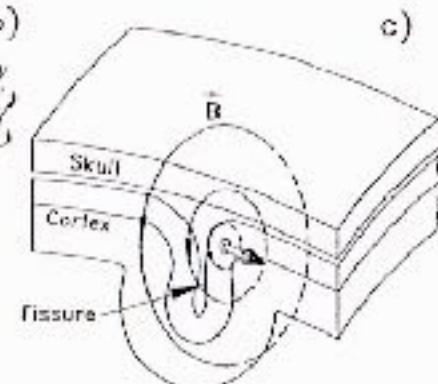
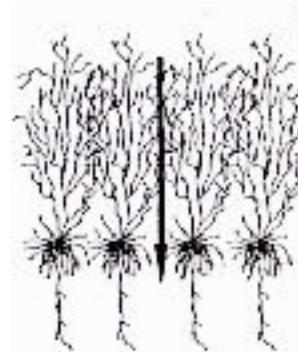
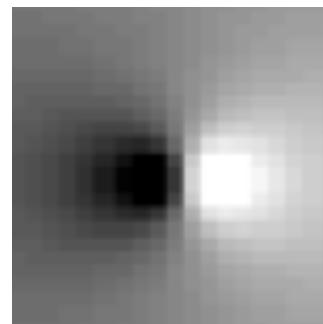
## Neuronal Currents

### Magnetic Field

### Intracellular Current



### Surface Fields



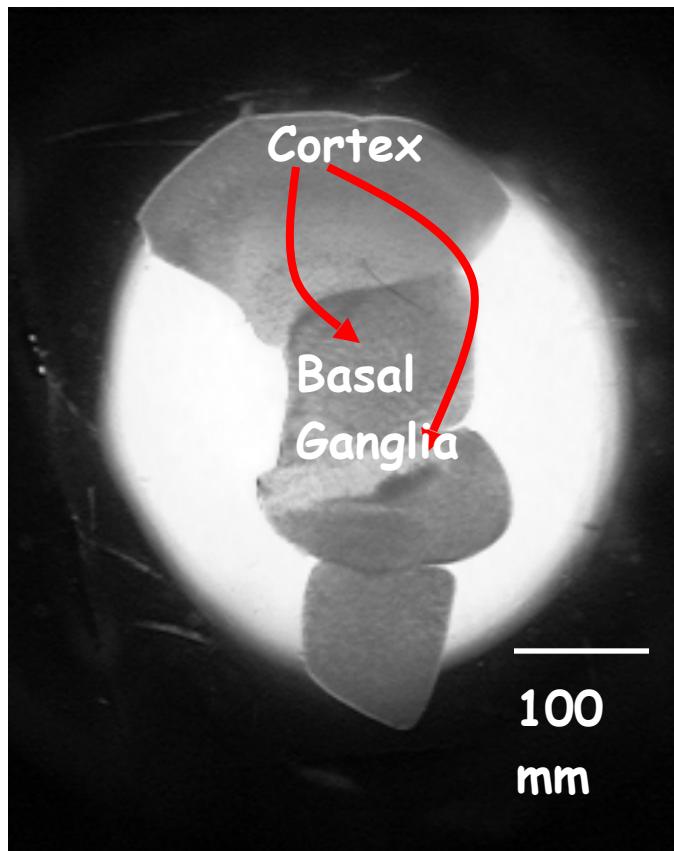
100 fT at on surface of skull

And 0.2 nT near source

P. A. Bandettini, N. Petridou, J. Bodurka, Direct detection of neuronal activity with MRI: fantasy, possibility, or reality? *Applied MRI* 29 (1) pp. 65-88

## In Vitro Results

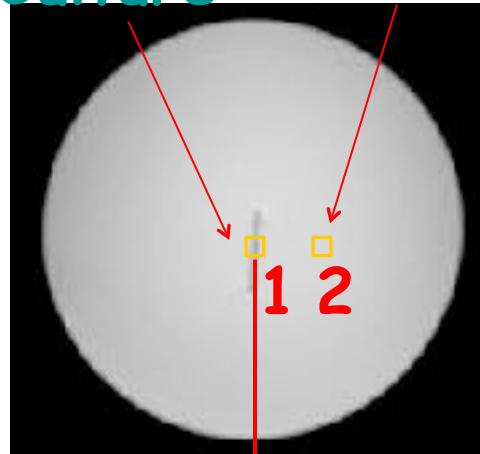
Organotypic (no blood supply or hemoglobin traces) sections of newborn-rat somato-sensory Cortex, or somato-sensory Cortex & Basal Ganglia



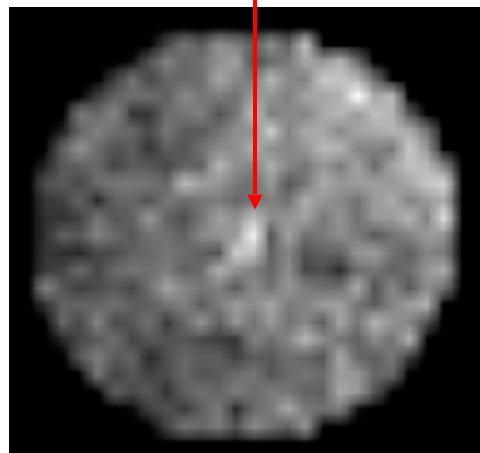
- Size: in-plane:~1-2mm<sup>2</sup>, thickness: 60-100μm
- Neuronal Population: 10,000-100,000
- Spontaneous synchronized activity < 2Hz
- Epileptiform activity
- Spontaneous beta freq. activity (20-30Hz)
- Network Activity Range: ~ 0.5-15μV

# Technology

Culture ACSF



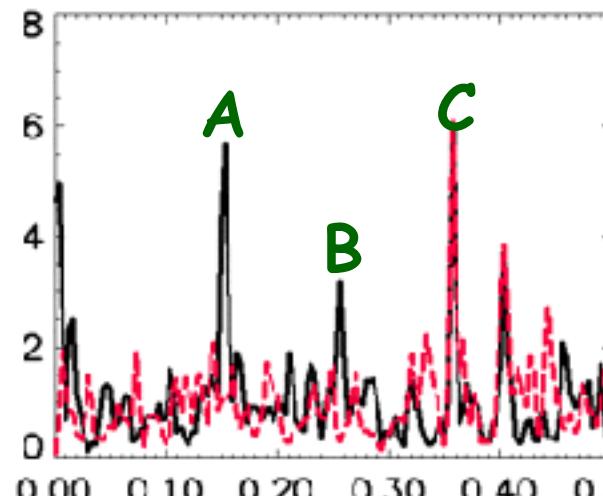
FSE image



0.15Hz map

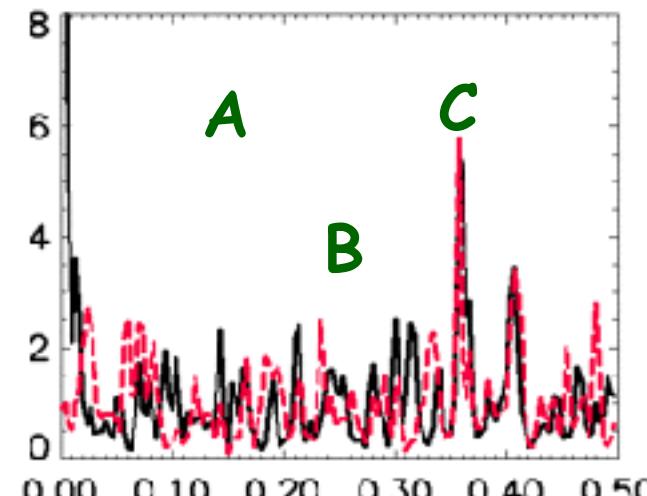
# New Contrasts Neuronal Currents

1: culture



Hz

2: ACSF



Hz

Active condition: black line

Inactive condition: red line

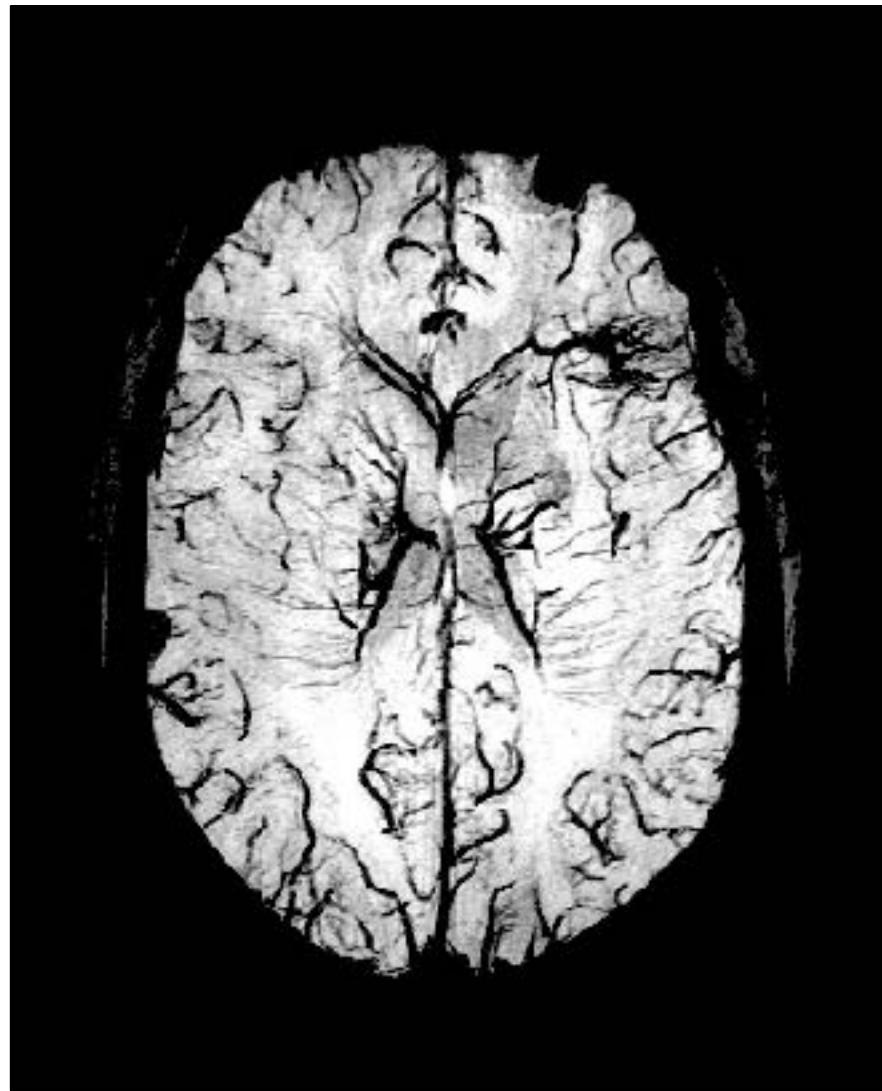
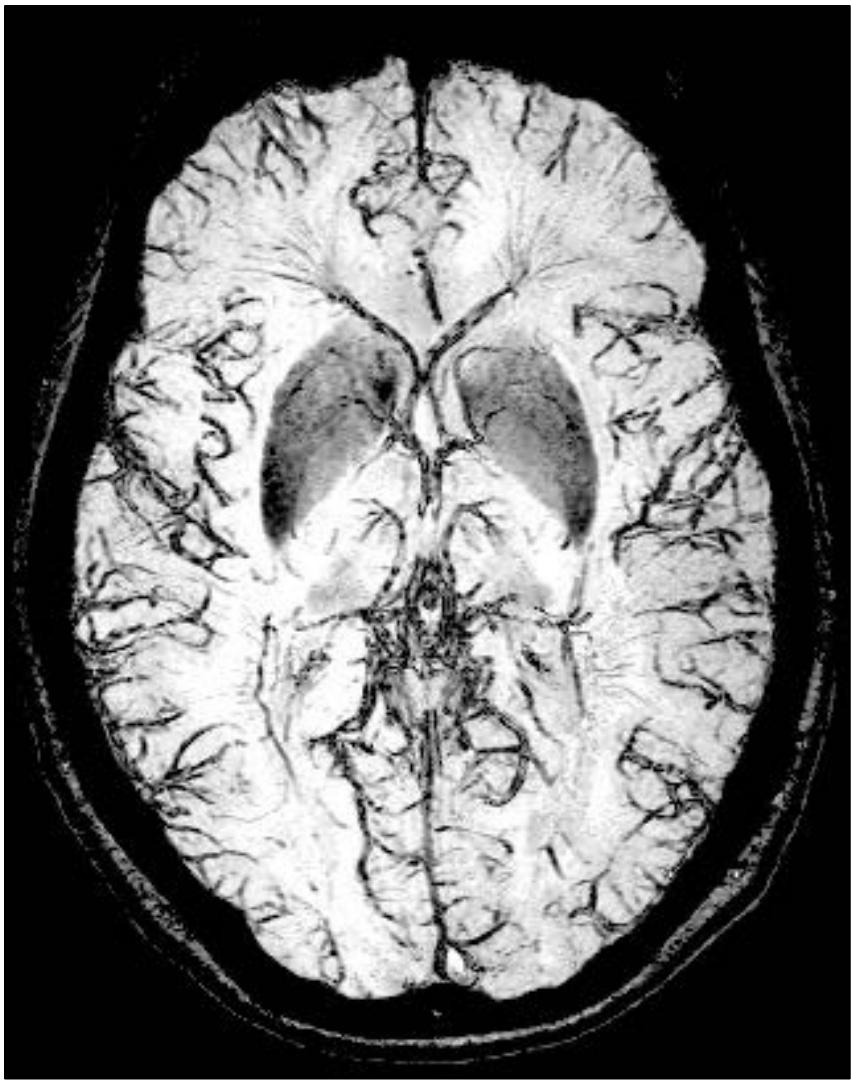
A: 0.15 Hz activity, on/off frequency

B: activity

C: scanner noise (cooling-pump)

N. Petridou, D. Plenz, A. C. Silva, J. Bodurka, M. Loew, P. A. Bandettini,  
Direct Magnetic Resonance detection of neuronal electrical activity, Proc. Nat'l.  
Acad. Sci. USA. 103, 16015-16020 (2006).

BOLD effect to highlight veins: 3 Tesla



Bove-Bettis, et al (2004), SMRT



## Enhancing BOLD response in the auditory system by neurophysiologically tuned fMRI sequence

Erich Seifritz,<sup>a,b,\*</sup> Francesco Di Salle,<sup>c</sup> Fabrizio Esposito,<sup>d</sup> Marcus Herdener,<sup>a,c</sup>  
John G. Neuhoff,<sup>c</sup> and Klaus Scheiller<sup>f</sup>

<sup>a</sup>University Hospital of Clinical Psychiatry, University of Bern, 3000 Bern, Switzerland

<sup>b</sup>Department of Psychiatry, University of Basel, 4025 Basel, Switzerland

<sup>c</sup>Department of Neuroscience, University of Pisa, 56125 Pisa, Italy

<sup>d</sup>Department of Neurological Sciences, University of Naples Federico II, 80127 Naples, Italy

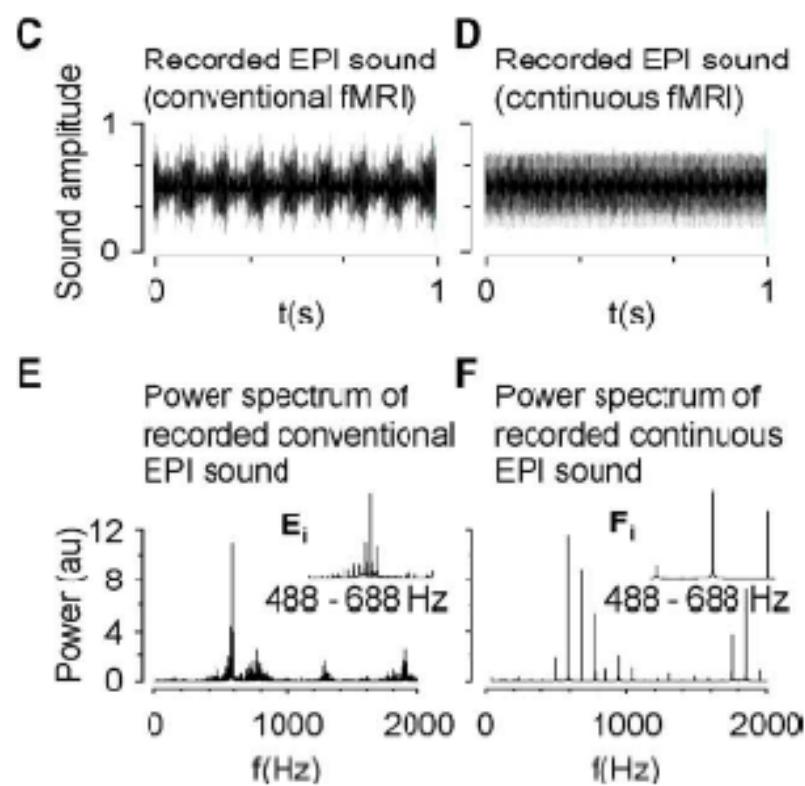
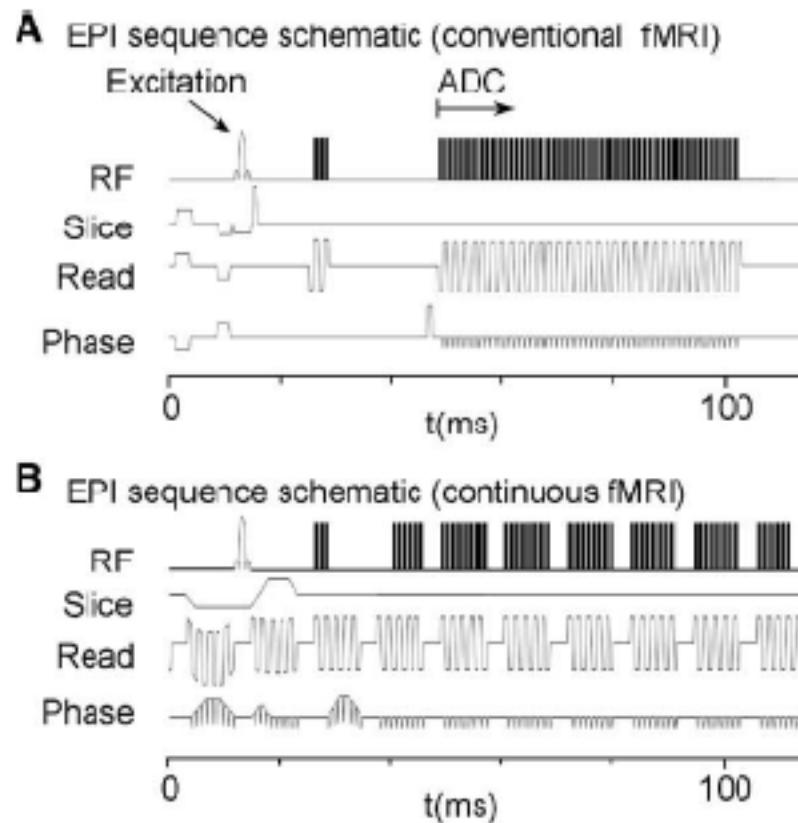
<sup>e</sup>Department of Psychology, The College of Wooster, Wooster, OH 44691, USA

<sup>f</sup>MRI-Pharm, Department of Medical Radiology, University of Basel, 4031 Basel, Switzerland

Received 26 May 2005; revised 22 July 2005; accepted 23 August 2005

Available online 25 October 2005

# Technology



# Technology

Response to sound and light in auditory and visual cortex:  
main effect [continuous plus conventional fMRI]

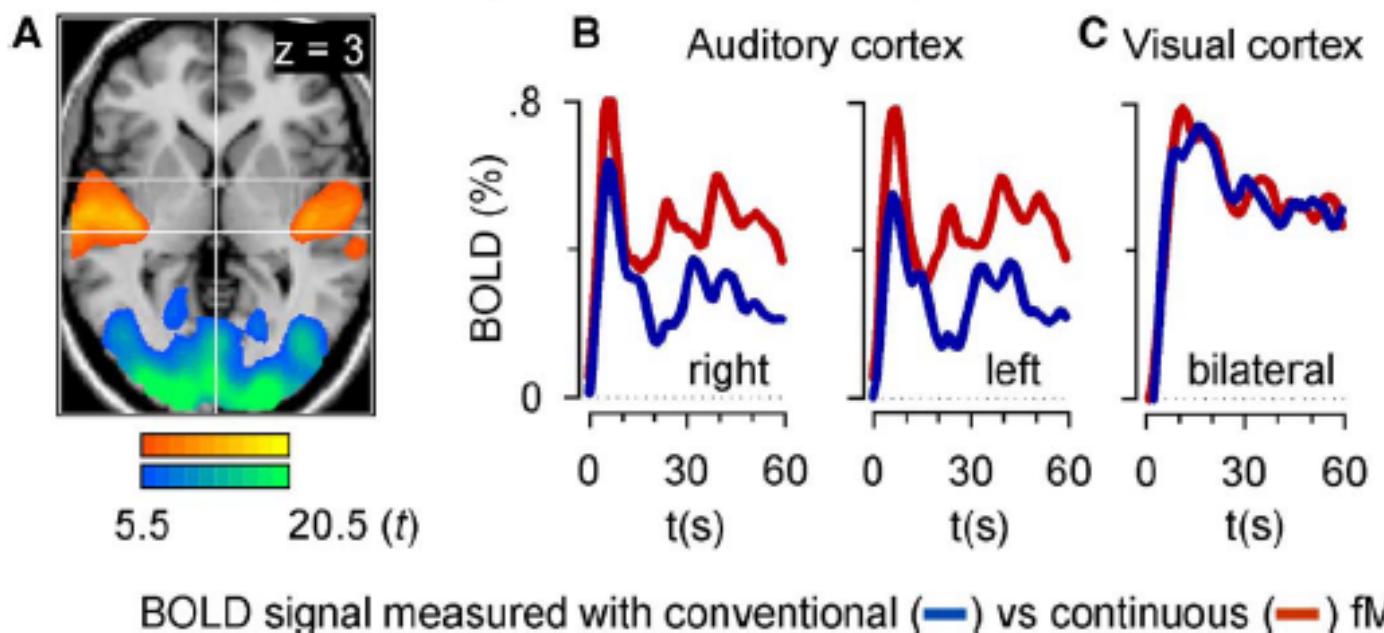


Fig. 4. (A) Main effects of response to pulsed sound and light measured with continuous-sound and conventional fMRI ( $P_{\text{corrected}} \leq 0.001$ ). Corresponding BOLD signal time-course in auditory (B) and visual (C) cortex (red, measured with continuous-sound fMRI; blue, measured with conventional fMRI). Note, continuous-sound fMRI produced an enhanced BOLD signal only in the auditory but not in the visual system, demonstrating a domain-specific physiological effect.

# Technology

Coil arrays  
High field strength  
High resolution  
Novel functional contrast

# Methodology

Connectivity assessment  
Multi-modal integration  
Pattern classification  
Task design

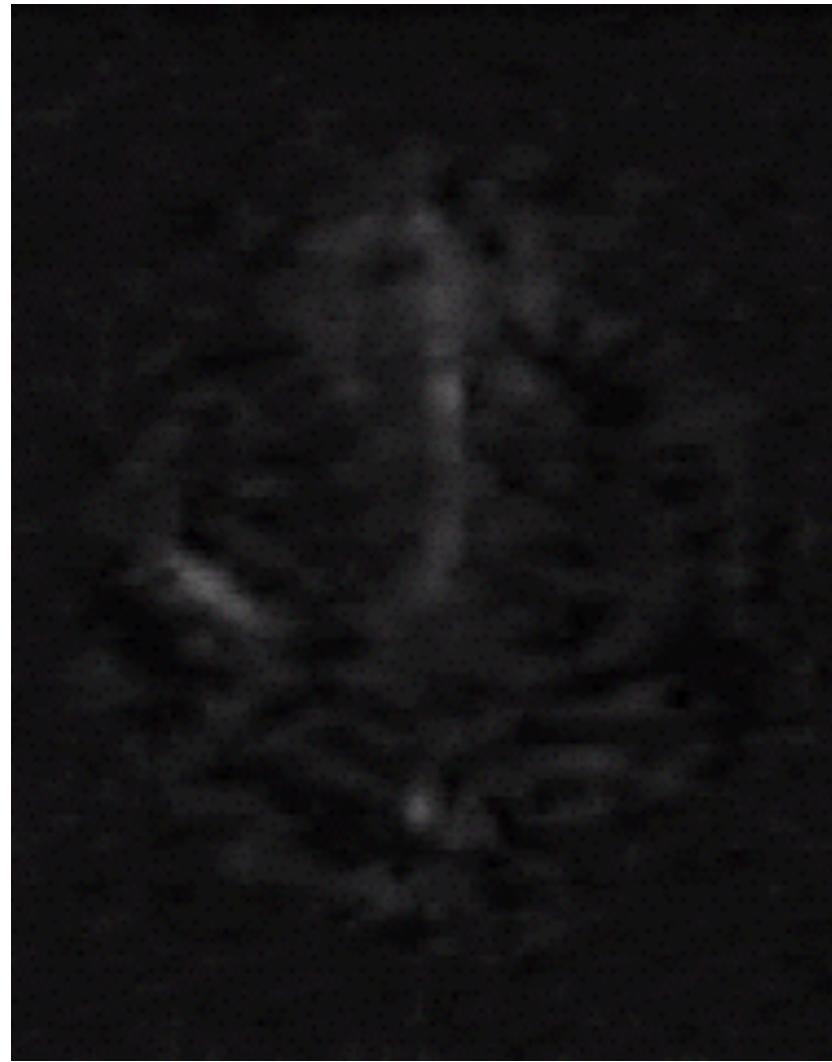
Fluctuations  
Dynamics  
Cross - modal comparison

Basic Neuroscience  
Behavior correlation/prediction  
Pathology correlation

# Interpretation

# Applications

# Methodology



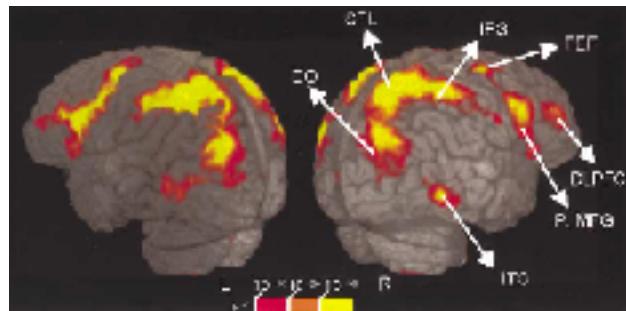
Mapping  $\leftrightarrow$  “Reading”

# Methodology

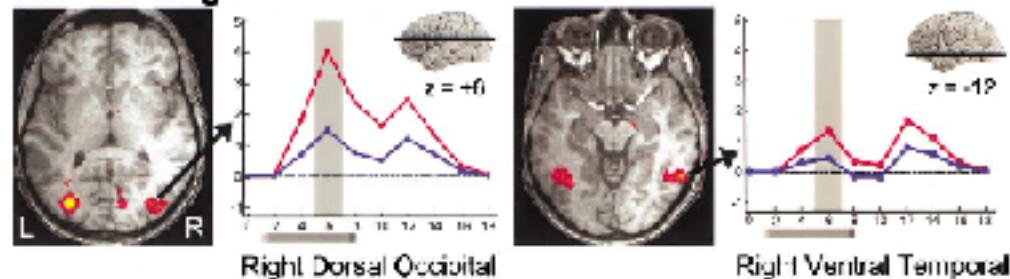
Neuron, Vol. 35, 975–987, August 29, 2002, Copyright ©2002 by Cell Press

## Neural Correlates of Visual Working Memory: fMRI Amplitude Predicts Task Performance

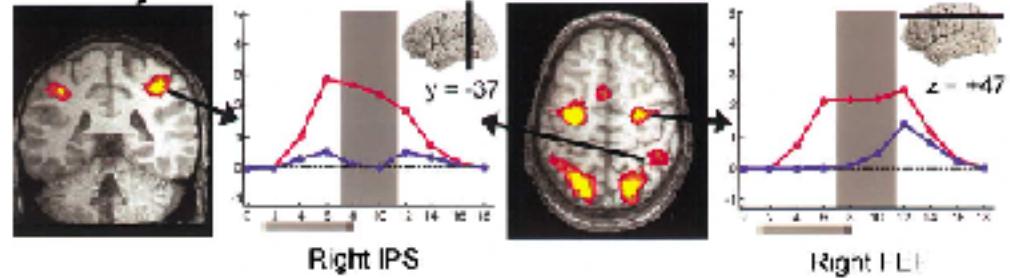
Luiz Pessoa,<sup>1</sup> Eva Gutierrez, Peter A. Bandettini,  
and Leslie G. Ungerleider  
Laboratory of Brain and Cognition  
National Institute of Mental Health  
National Institutes of Health  
Bethesda, Maryland 20892



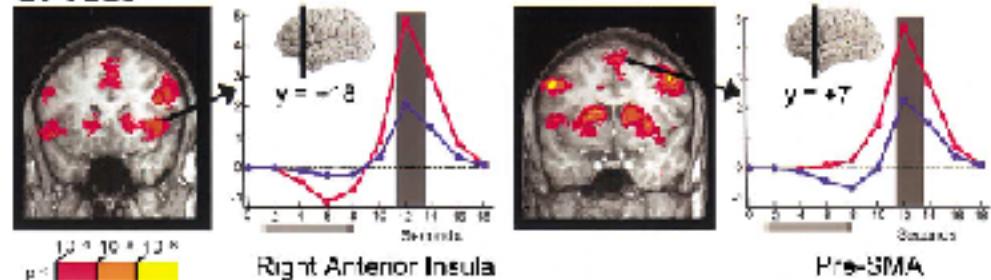
### A. Encoding



### B. Delay



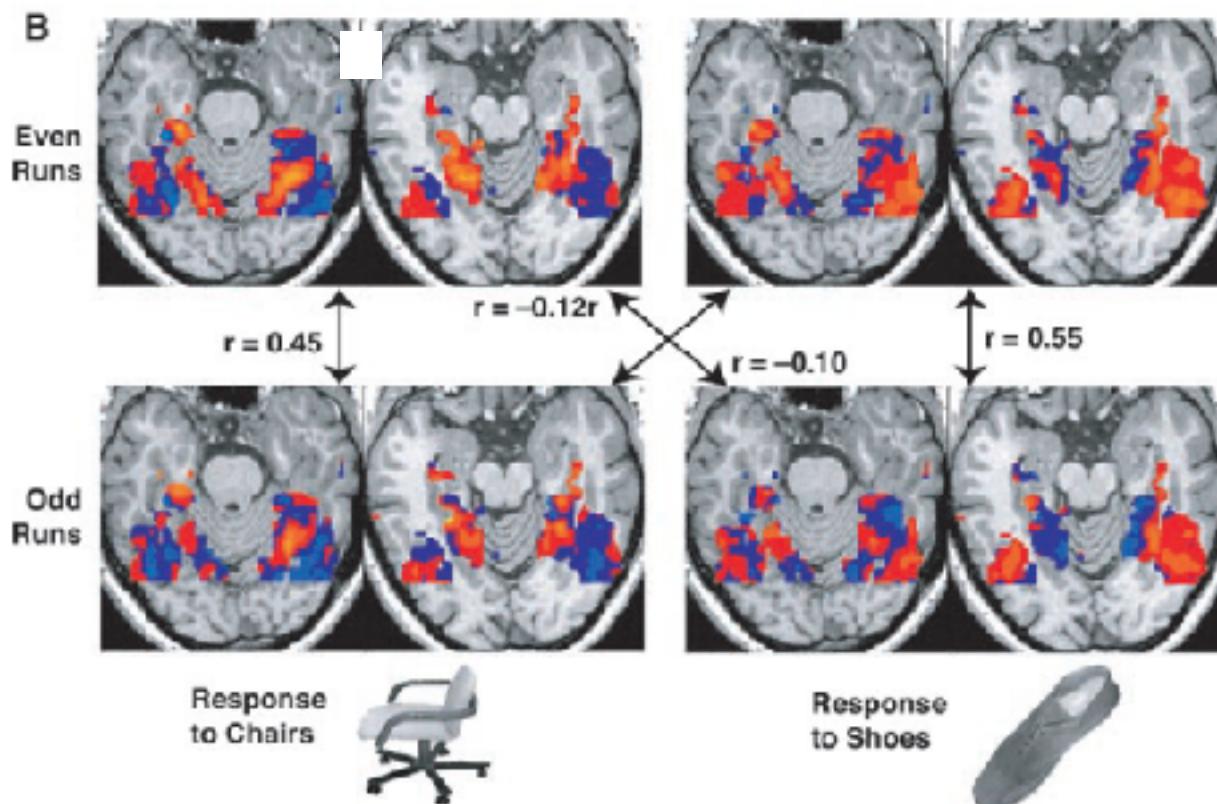
### C. Test



# Methodology

## Ventral temporal category representations

Object categories are associated with distributed representations in ventral temporal cortex



Haxby et al. 2001

# Methodology

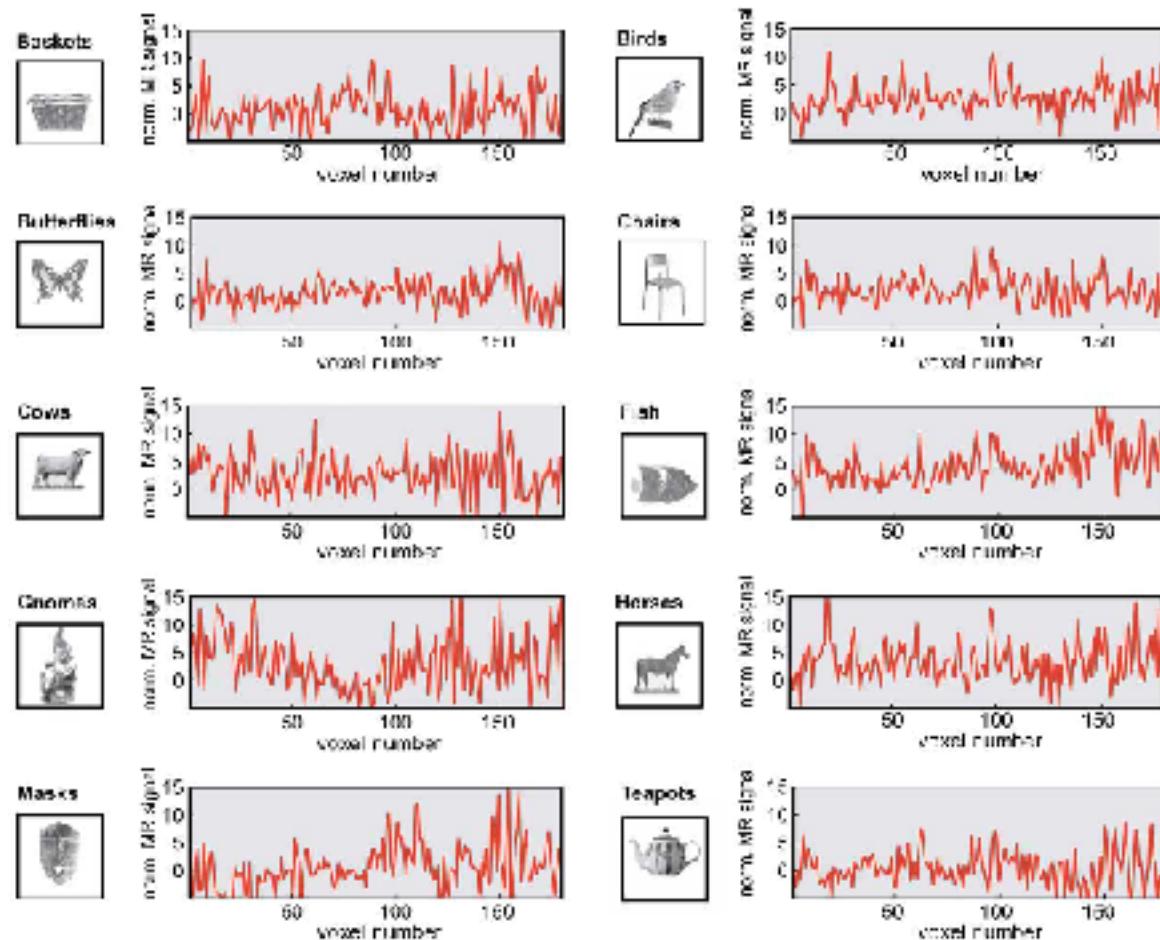
Functional magnetic resonance imaging (fMRI) "brain reading":  
detecting and classifying distributed patterns of fMRI activity  
in human visual cortex

David D. Cox<sup>a,b,\*†</sup> and Robert L. Savoy<sup>a,c</sup>

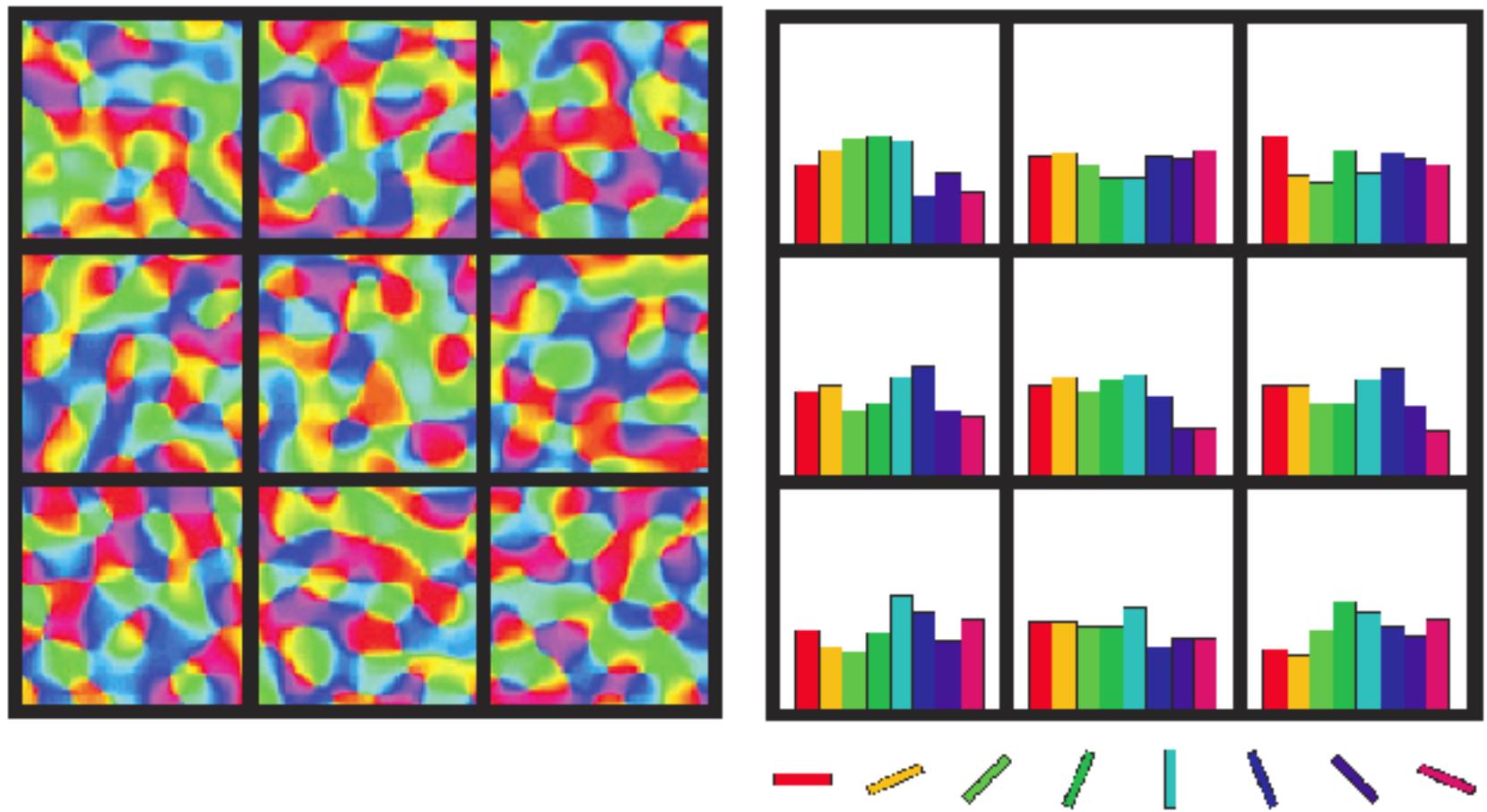
<sup>a</sup> Broad Institute for Science Cambridge, MA 02142, USA  
<sup>b</sup> McGovern Institute for Brain Research and Picower Center for Learning and Memory, Cambridge, MA 02129, USA  
<sup>c</sup> Dept. Psych., U. of. P. D. Ross, Toronto, M4J 1P2, Canada

Received 15 July 2002; accepted 10 December 2002

NEUROIMAGE 19 (2): 261-270 Part 1 JUN 2003



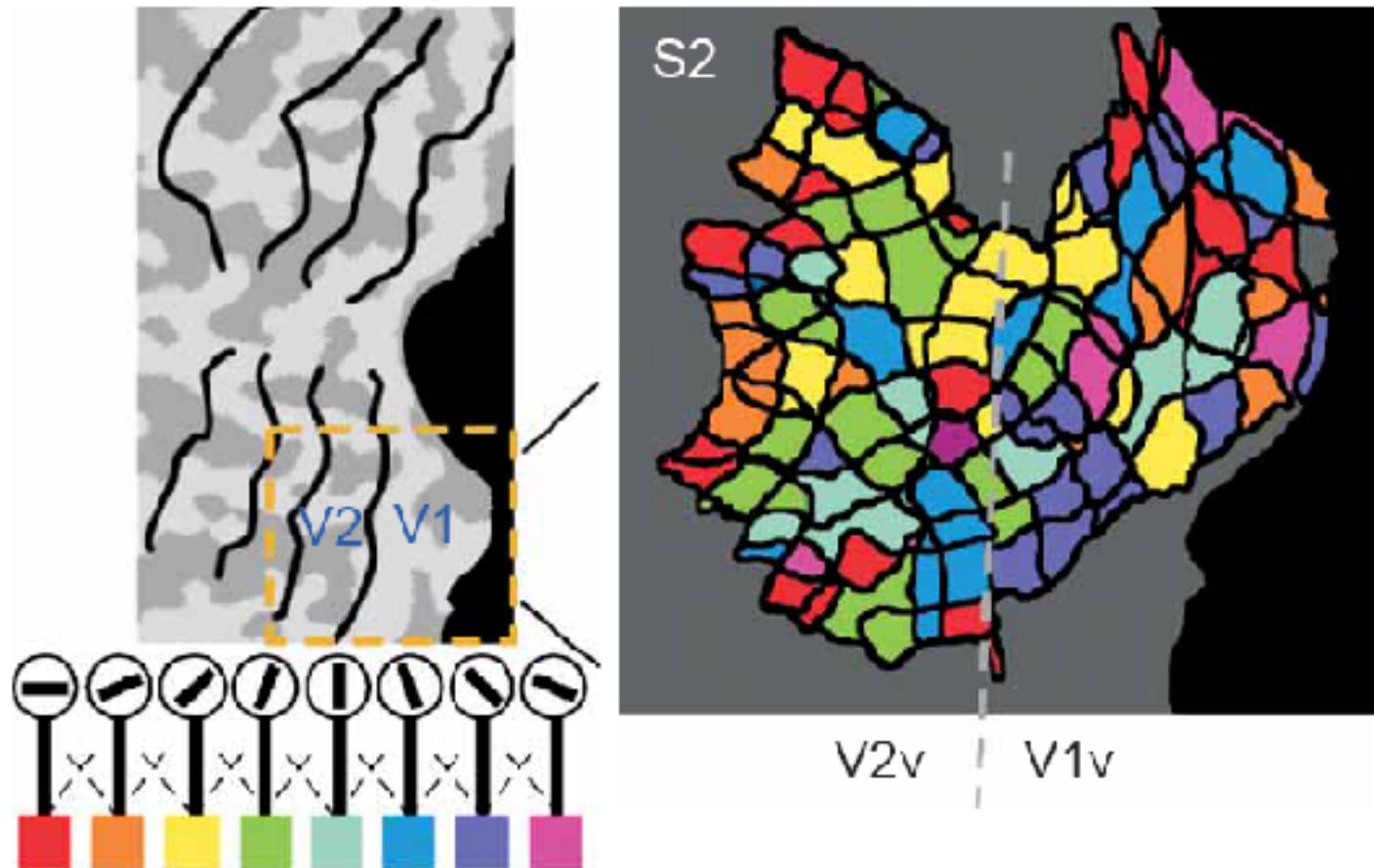
# Methodology



Boynton (2005), News & Views on Kamitani & Tong (2005) and Haynes & Rees (2005)

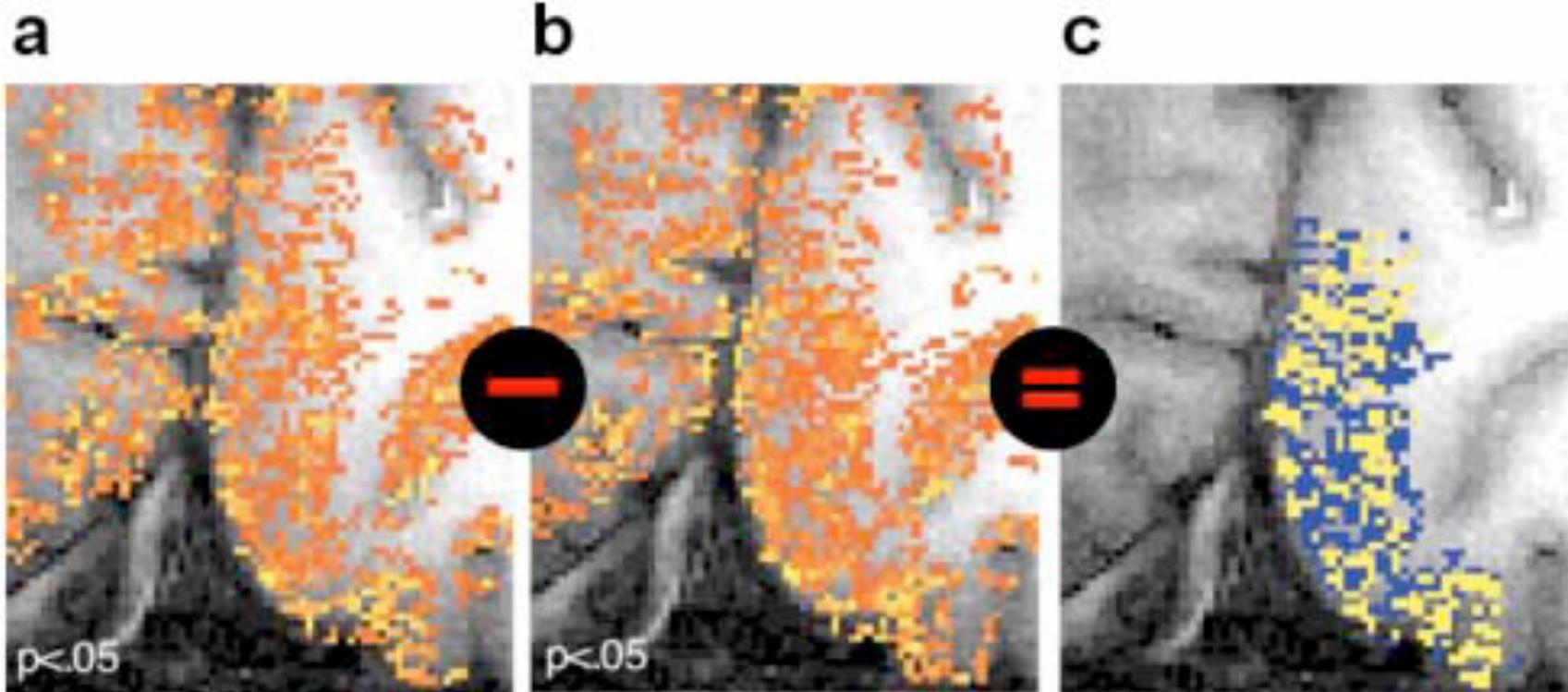
# Methodology

Lower spatial frequency clumping



Kamitani & Tong (2005)

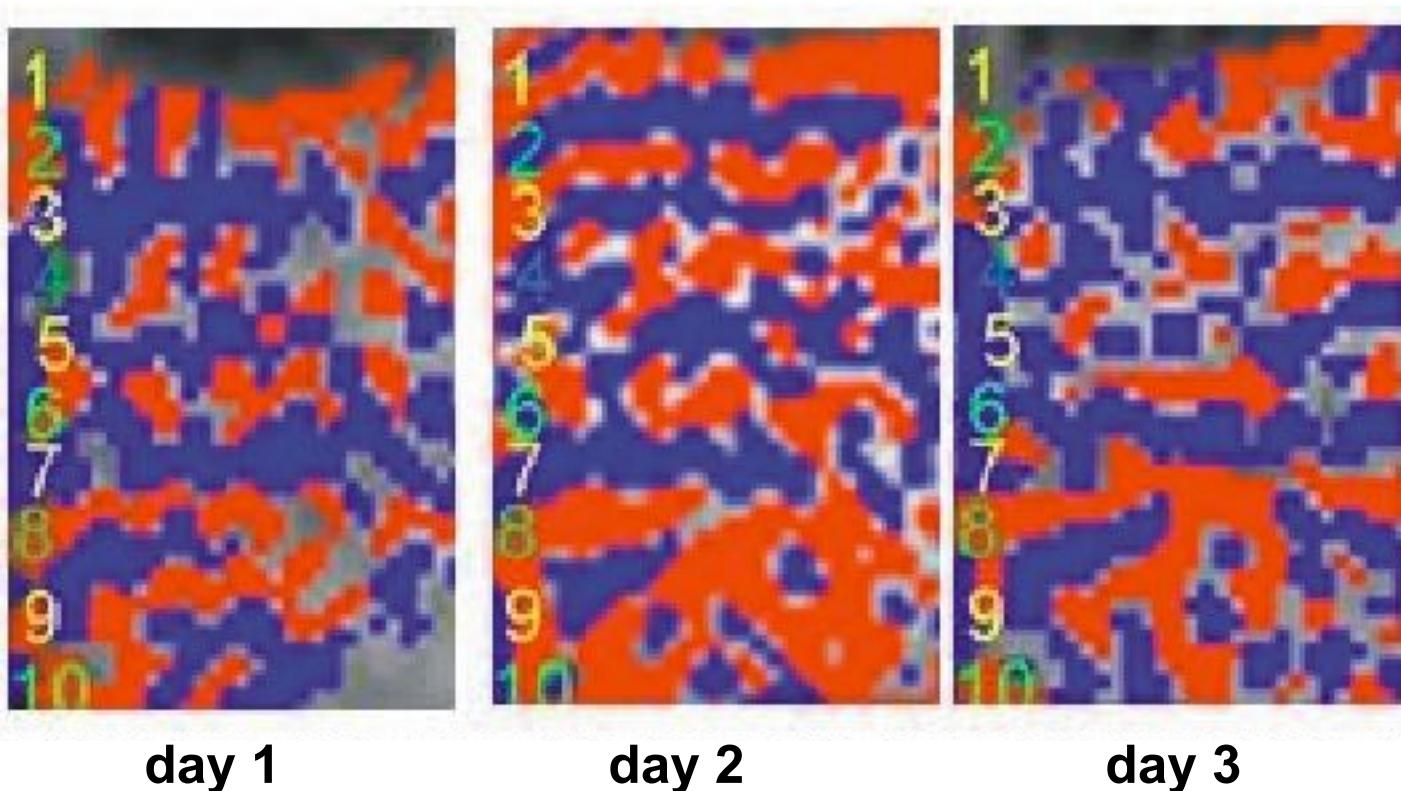
# What to do with high resolution data?



What to do with high resolution data?

## HSE-BOLD demonstration of ocular dominance columns

human, 7T,  $0.5 \times 0.5 \times 3 \text{ mm}^3$



Yacoub et al: differential maps contrasting stimulation of the left and right eye

**neuronal  
activity pattern**

**condition 1**



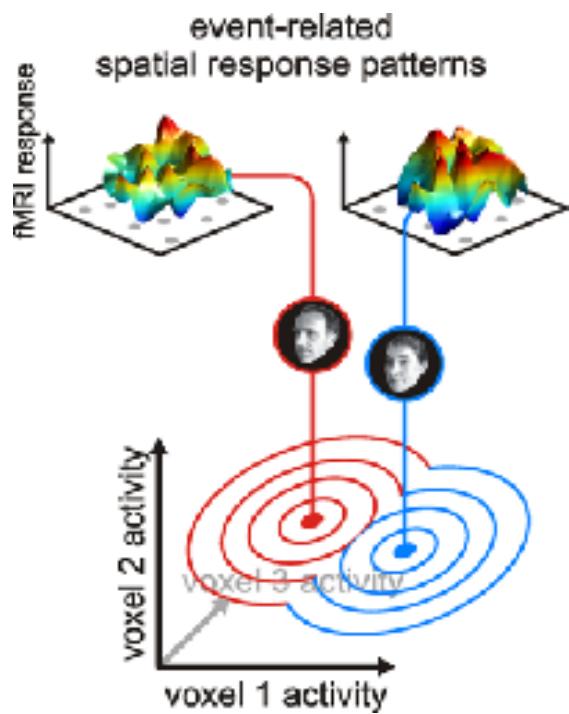
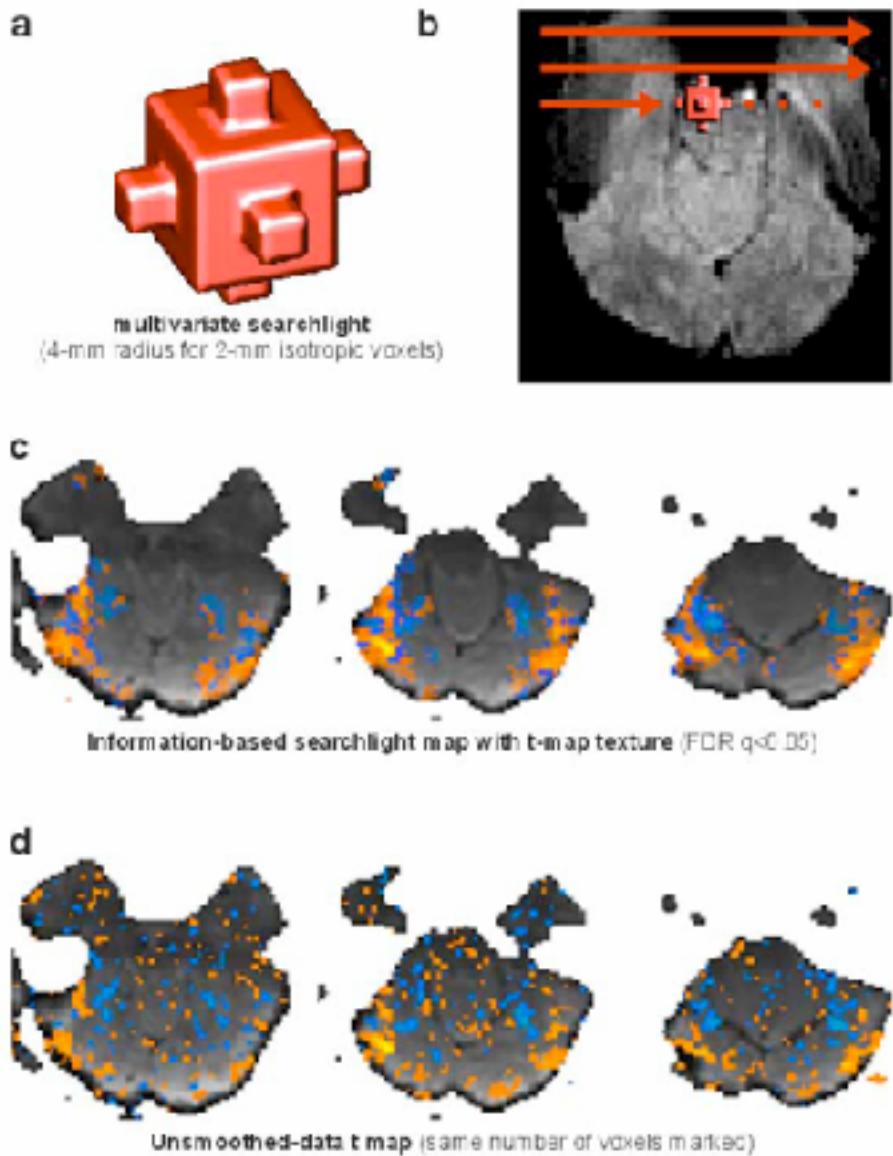
hemodynamics

**fMRI  
activity pattern**



**condition 2**





N. Kriegeskorte, R. Goebel, P. Bandettini,  
Information-based functional brain mapping.  
Proc. Nat'l. Acad. Sci. USA, 103,  
3863-3868 (2006).

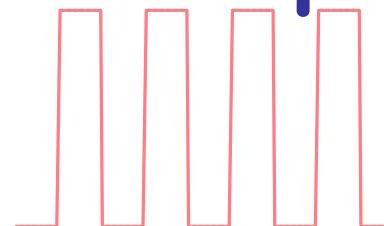
# Pattern-recognition analysis of fMRI activity patterns

- Haxby et al. (2001)
- Cox & Savoy (2003)
- Carlson et al. (2003)
- Kamitani & Tong (2005)
- Haynes & Rees (2005)
- Kriegeskorte et al (2006)

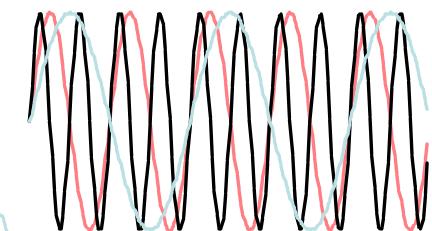
## Methodology

# Neuronal Activation Input Strategies

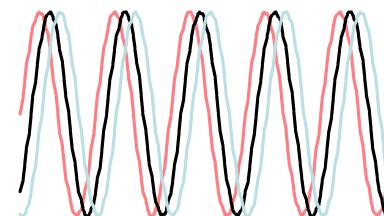
1. Block Design



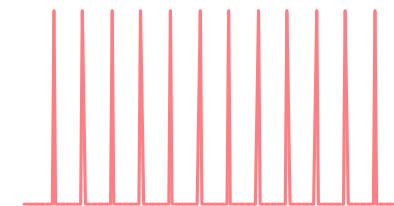
2. Frequency Encoding



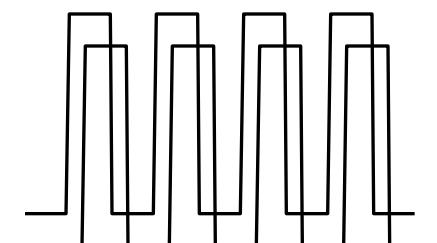
3. Phase Encoding



4. Event-Related

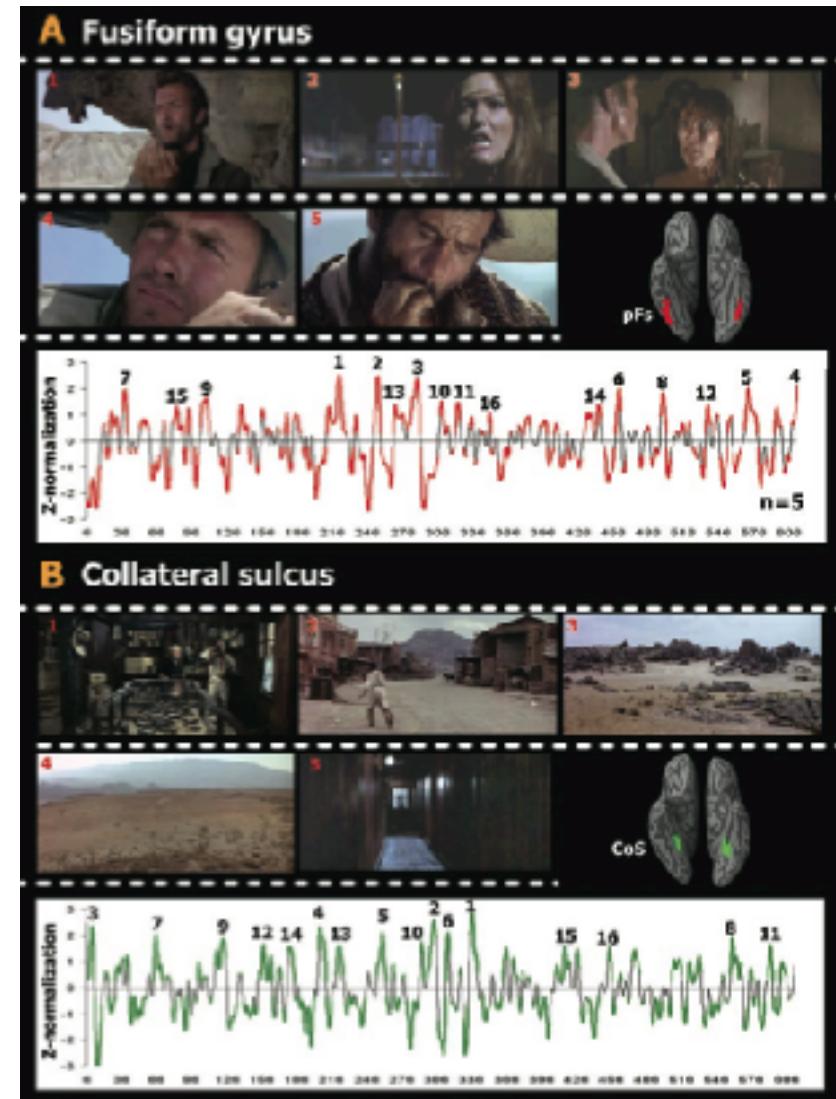
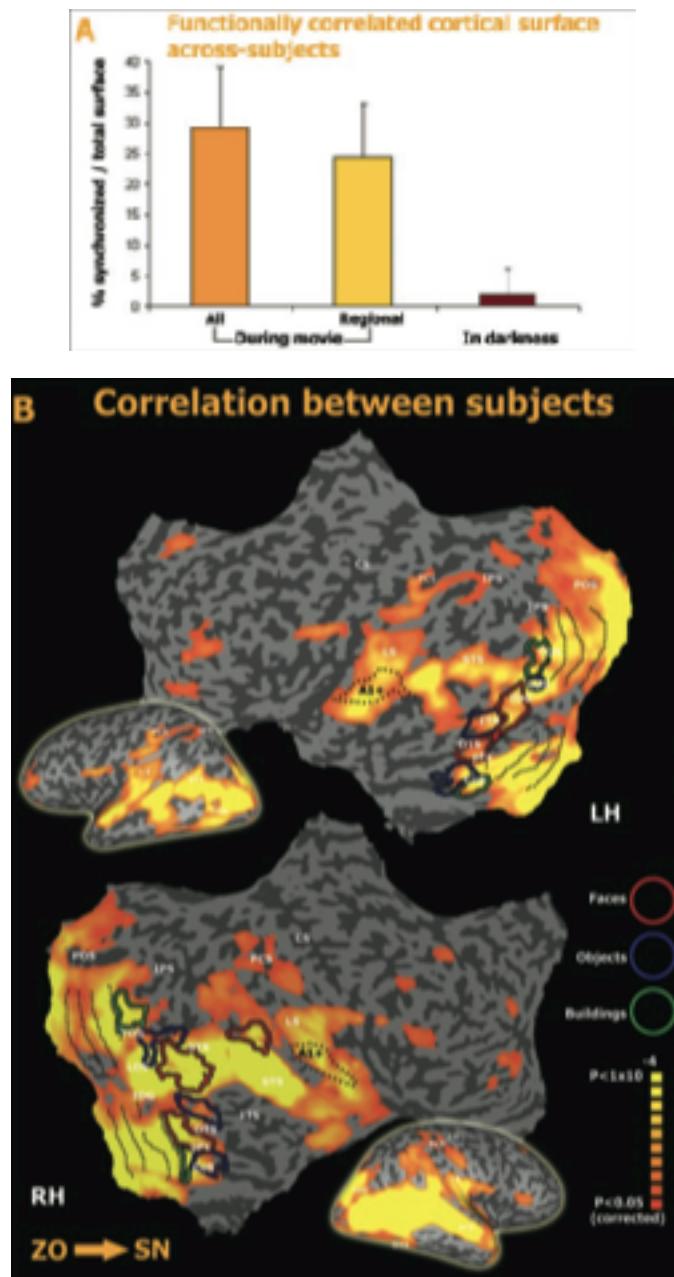


5. Orthogonal Block Design



6. Free Behavior Design.

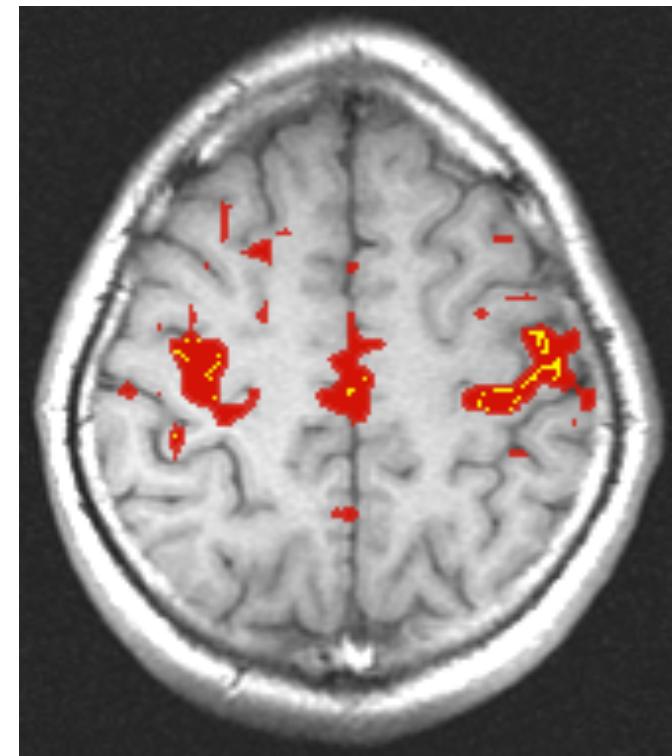
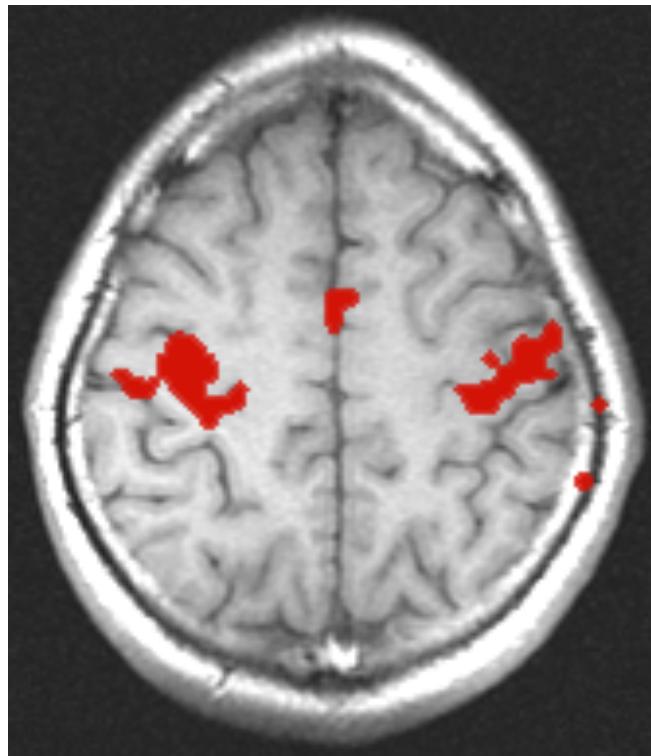
# Methodology



Hasson, et al (2004), Science, 303, 1634-1640

# Resting State

## Resting State Correlations



Activation:

correlation with reference function

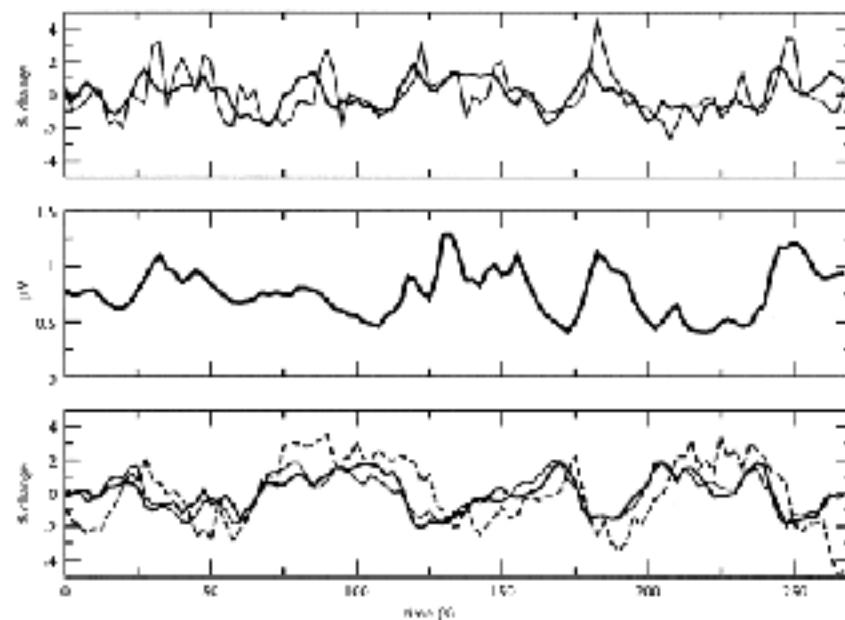
Rest:

seed voxel in motor cortex

# Resting State

BOLD correlated with 10 Hz power during "Rest"

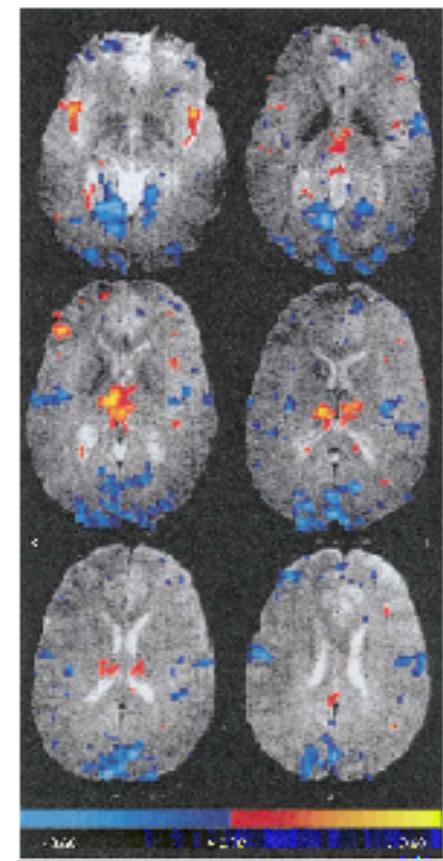
Positive



10 Hz power

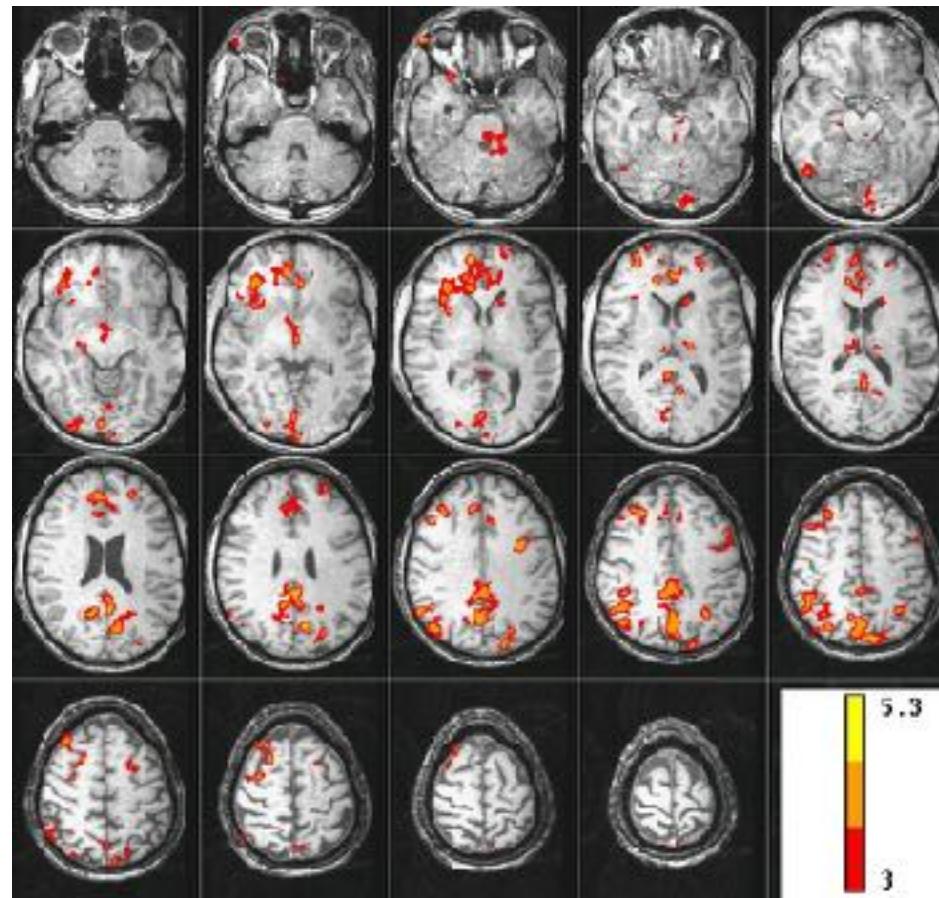
Negative

Goldman, et al (2002), Neuroreport



# Resting State

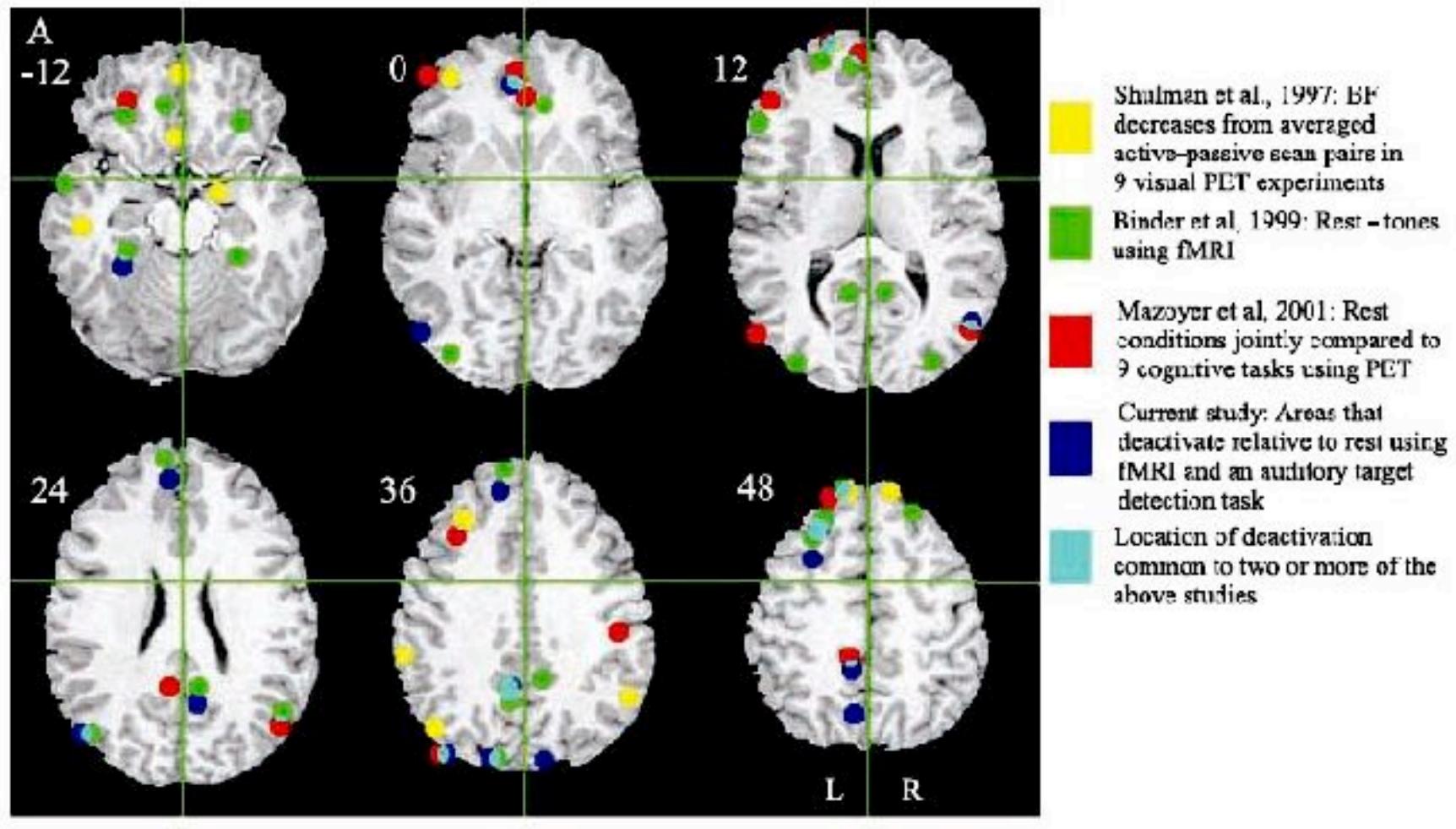
BOLD correlated with SCR during "Rest"



J. C. Patterson II, L. G. Ungerleider, and P. A  
Bandettini, NeuroImage 17: 1787-1806, (2002).

# Resting State

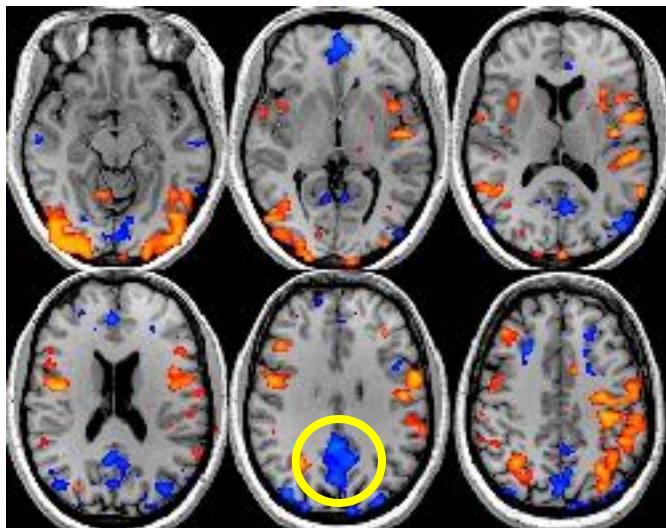
Regions showing *decreases* during cognitive tasks



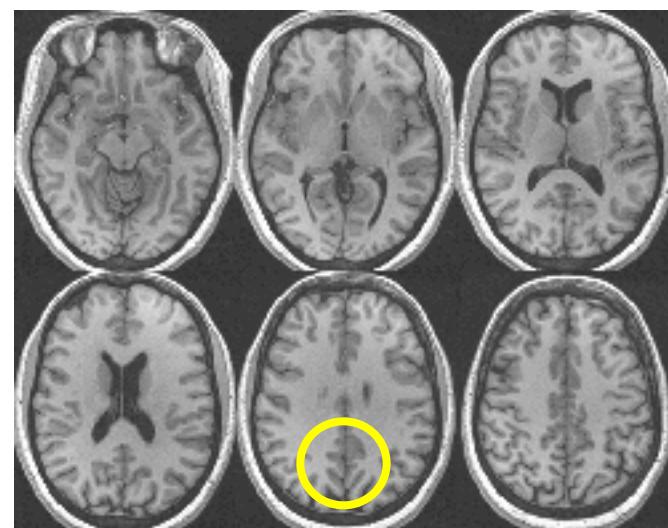
# Resting State

## Resting State Correlations vs Signal Decreases

- Filter (respiration (0.3Hz), cardiac (1 Hz))
- Define ROI (e.g. deactivations in posterior cingulate)
- Average time courses (at rest) in ROI
- Correlate average time course with all voxels



Lexical task



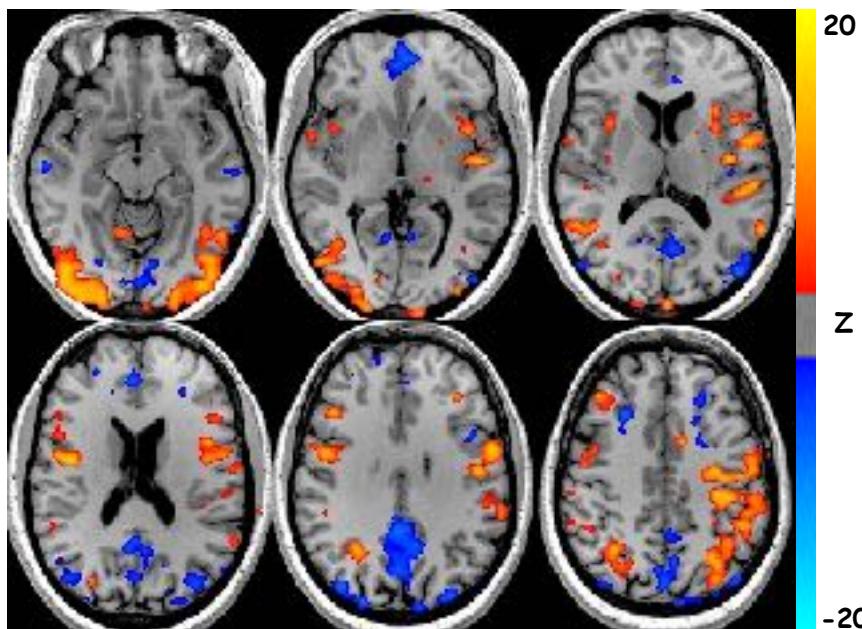
Rest

R. M. Birn, J. B. Diamond, M. A. Smith, P. A. Bandettini, Separating respiratory variation-related fluctuations from neuronal activity-related fluctuations in fMRI, NeuroImage 31, 1536-1548 (2006)

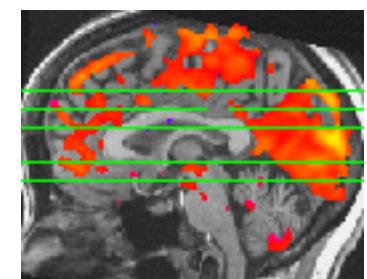
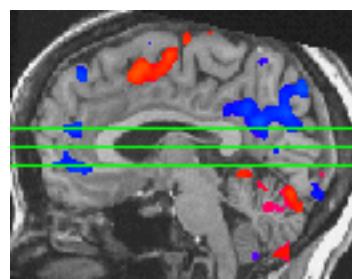
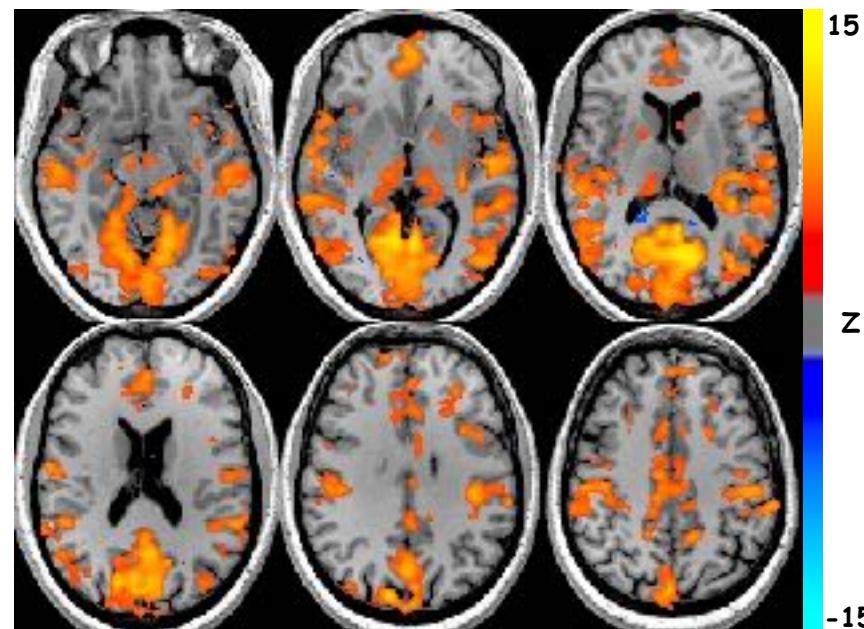
# Resting State

1 subject

Activations during lexical task



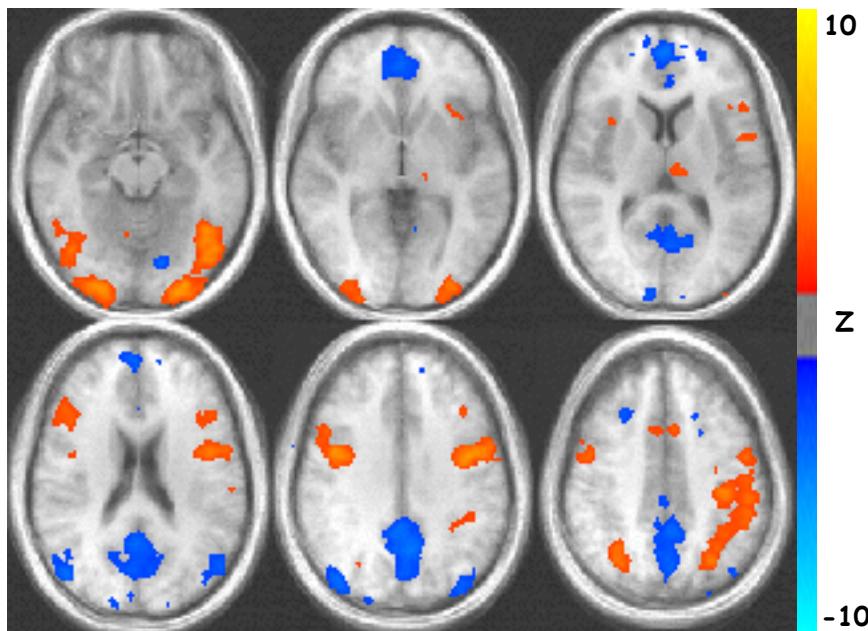
Correlation (of PC) at Rest



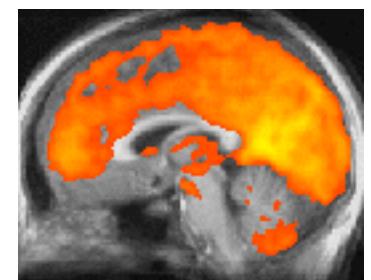
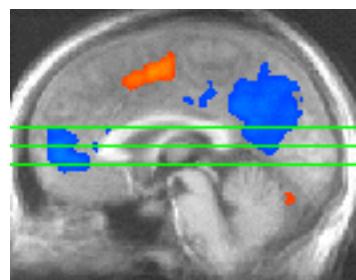
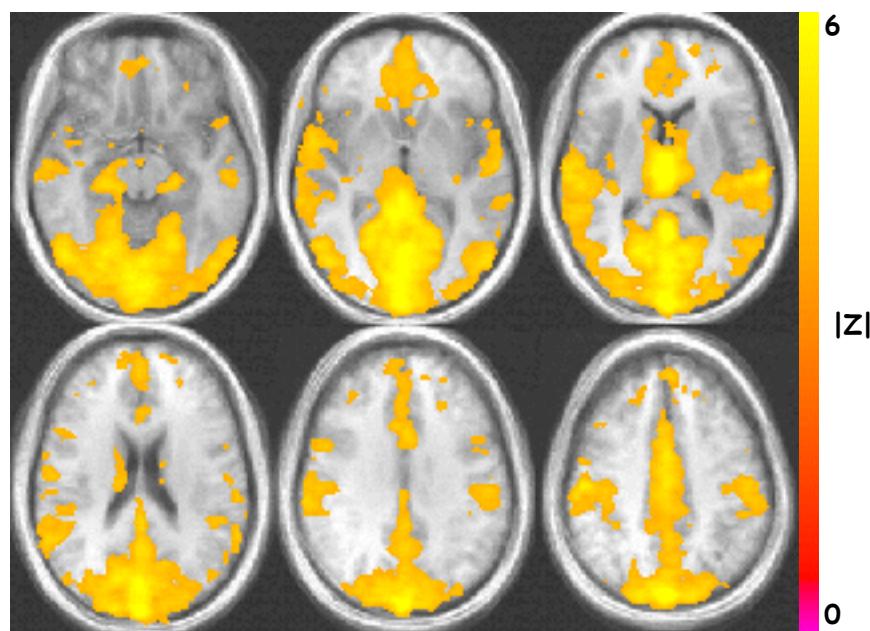
# Resting State

Group (n=10)

Activations during lexical task



Correlation (of PC) at Rest



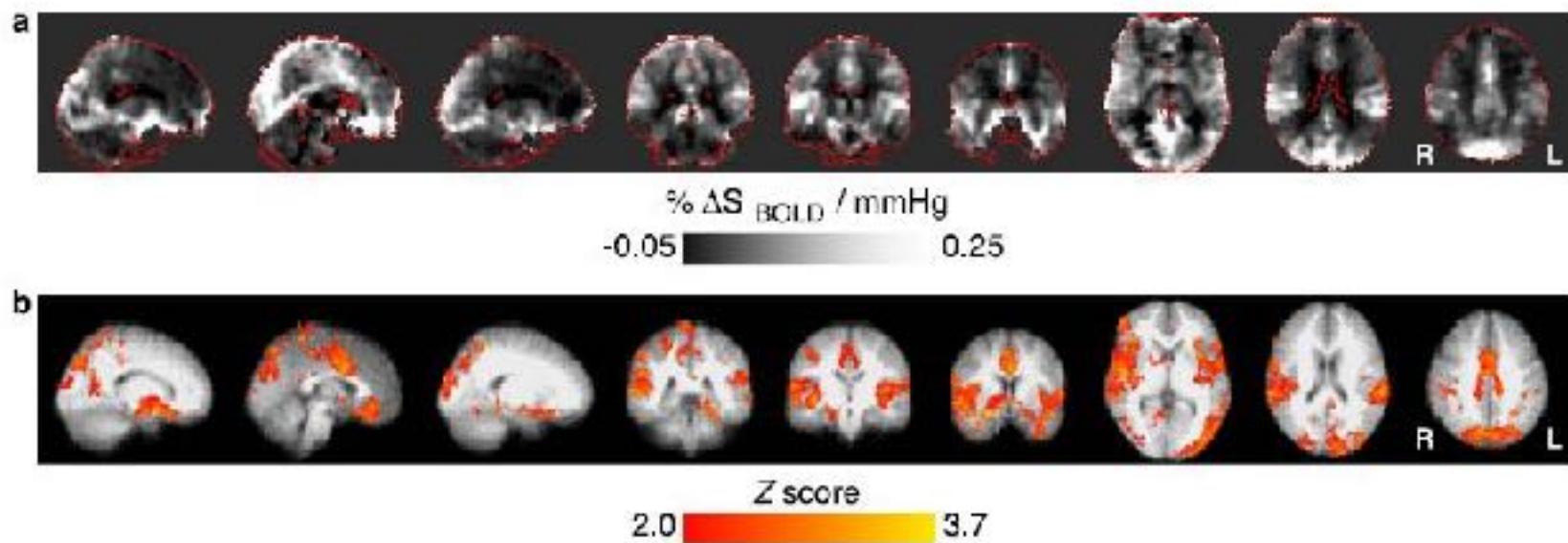
Respiration related

# Resting fluctuations in respiration

**Resting fluctuations in arterial carbon dioxide induce significant low frequency variations in BOLD signal**

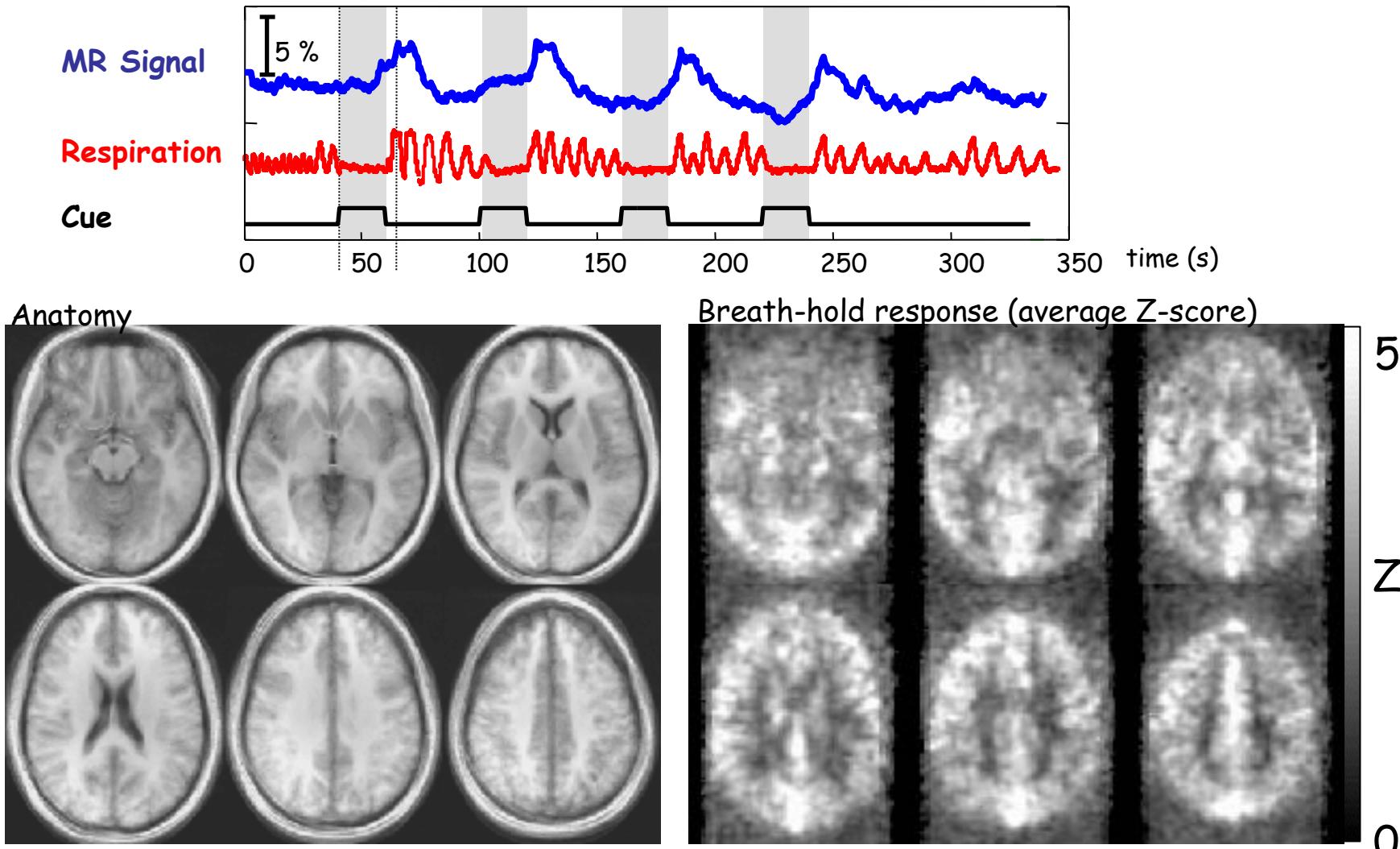
Richard G. Wise,<sup>a,b,\*</sup> Kojiro Ide,<sup>c,d</sup> Marc J. Poulin,<sup>c,d</sup> and Irene Tracey<sup>a,b</sup>

*NeuroImage 21, 2004*



Respiration related

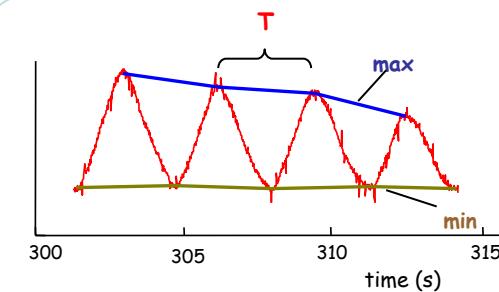
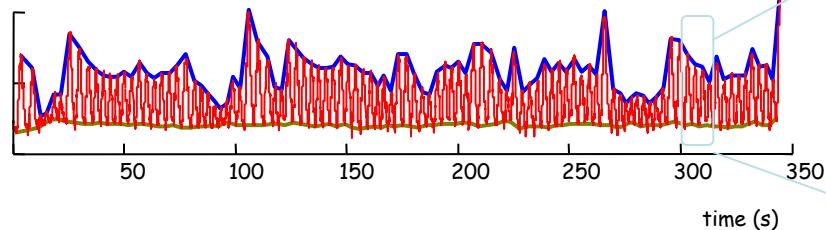
# Breath-holding Group Maps (N = 7)



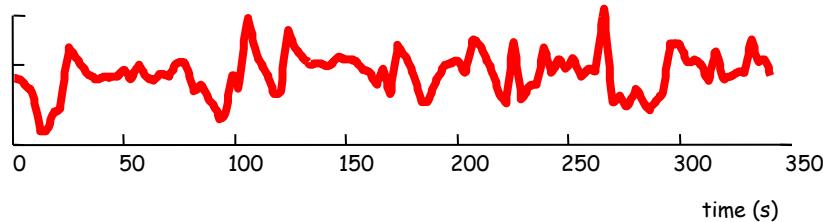
# Respiration related

## Estimating respiration volume changes

Respiration



Respiration Volume / Time (RVT)

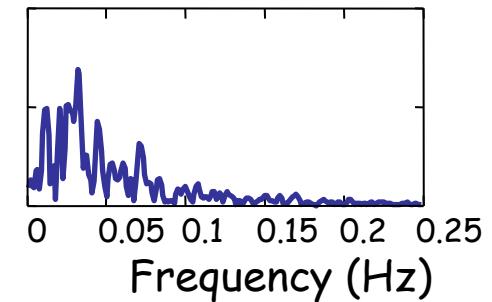
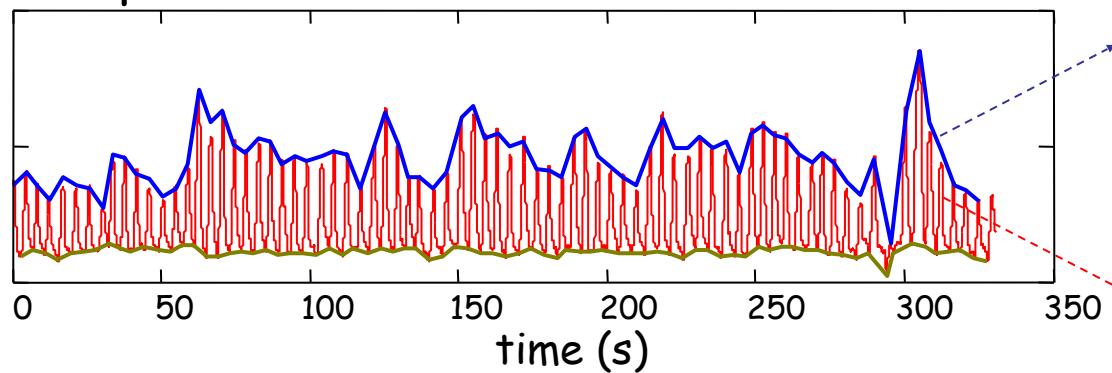


$$RVT = \frac{\text{max} - \text{min}}{T}$$

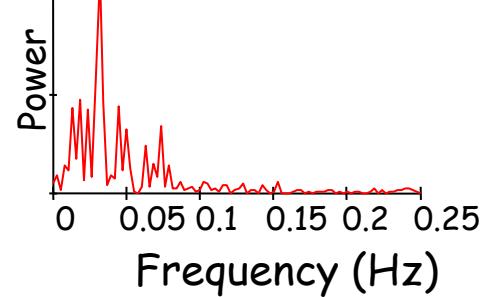
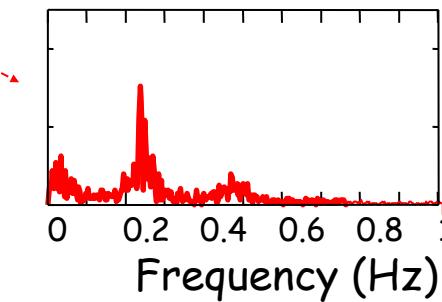
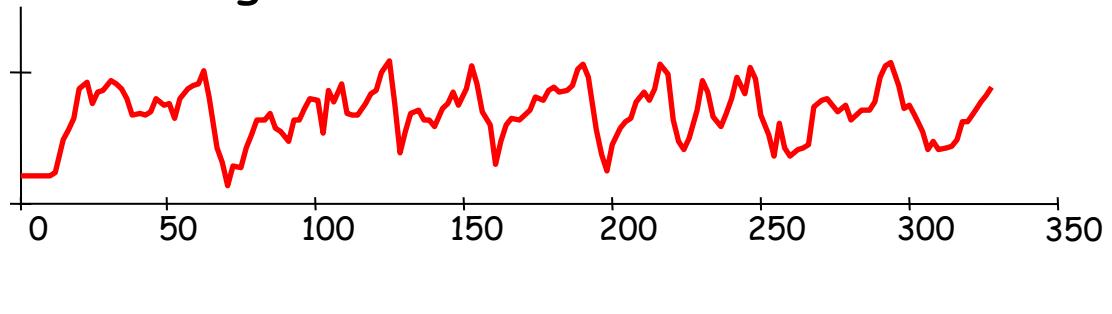
Respiration related

# Resting fluctuations in respiration

Respiration



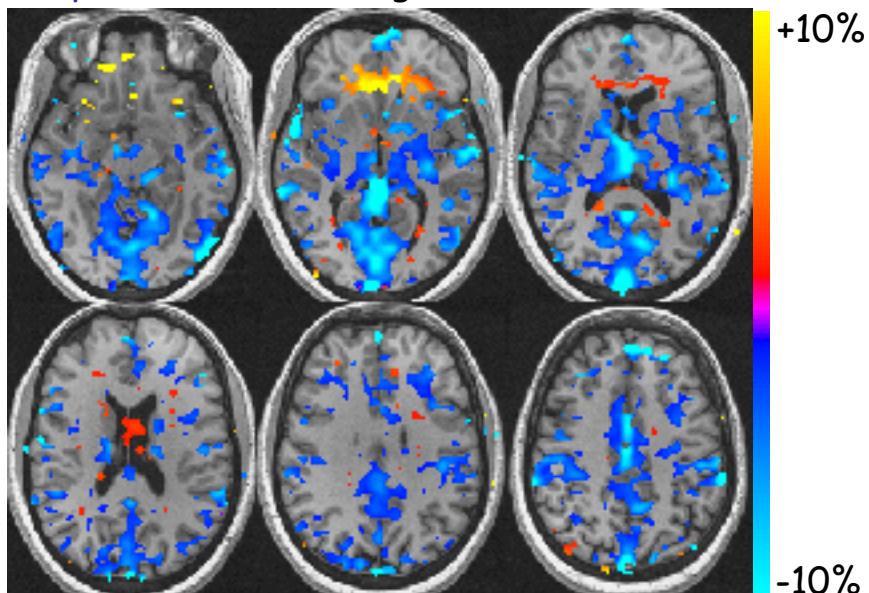
BOLD Signal



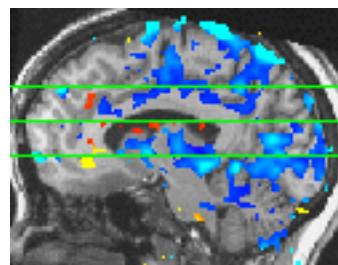
# Respiration related

## RVT related fluctuations

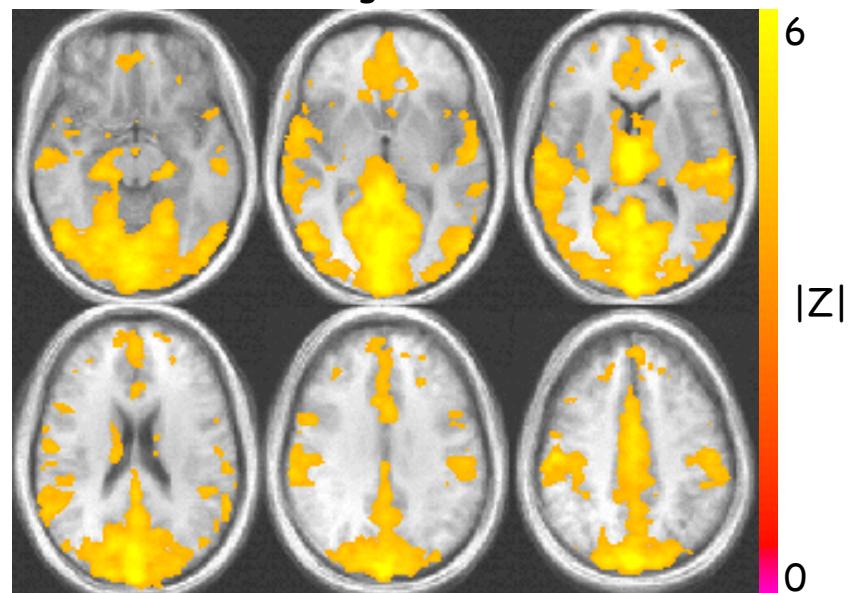
Amplitude of BOLD signal correlated w/ RVT



1 subject



Z-score of BOLD signal correlated w/ RVT



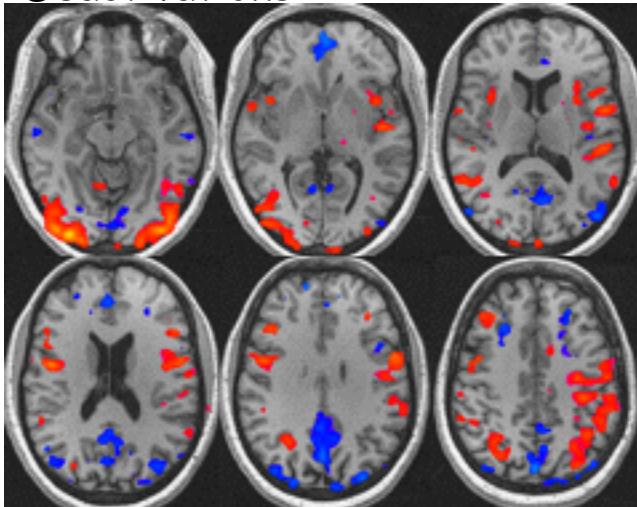
group (n=11)

RVT = Respiration Volume per Time

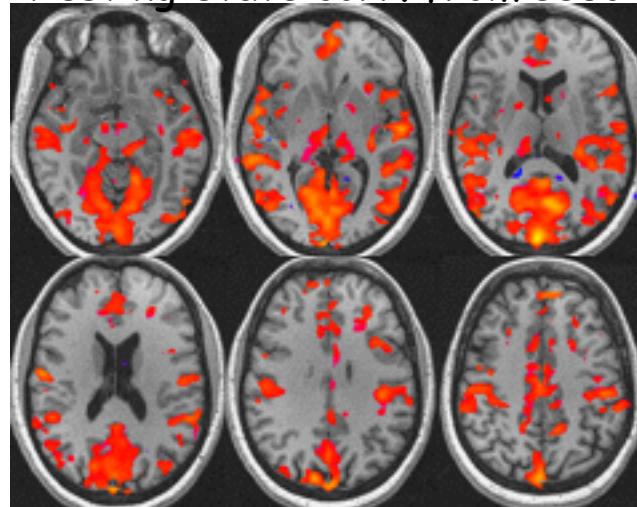
# Respiration effects

RVT changes co-localize

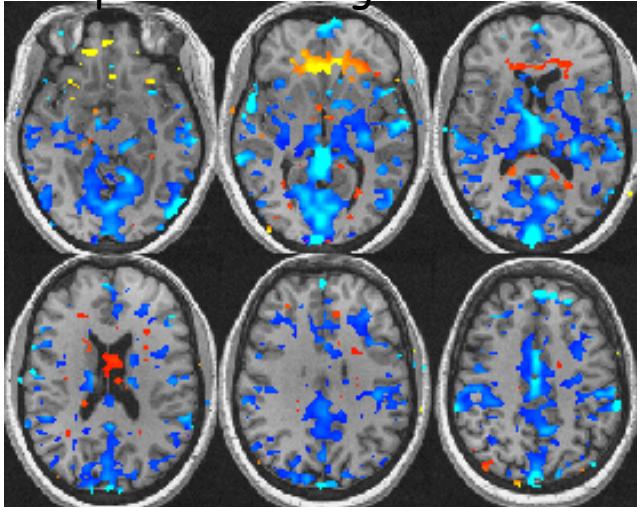
Deactivations



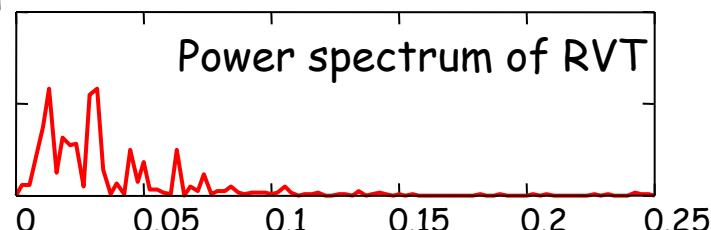
Resting-state corr. from seed ROI



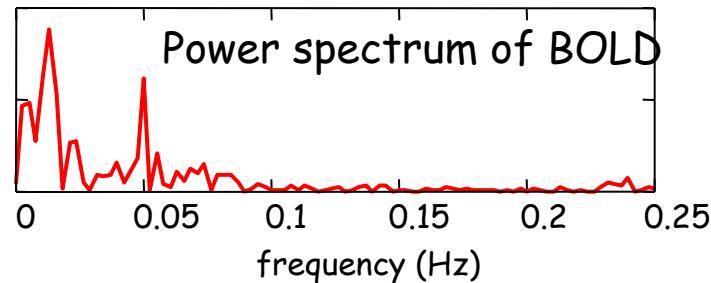
Respiration changes - corr. w/ RVT



Power spectrum of RVT

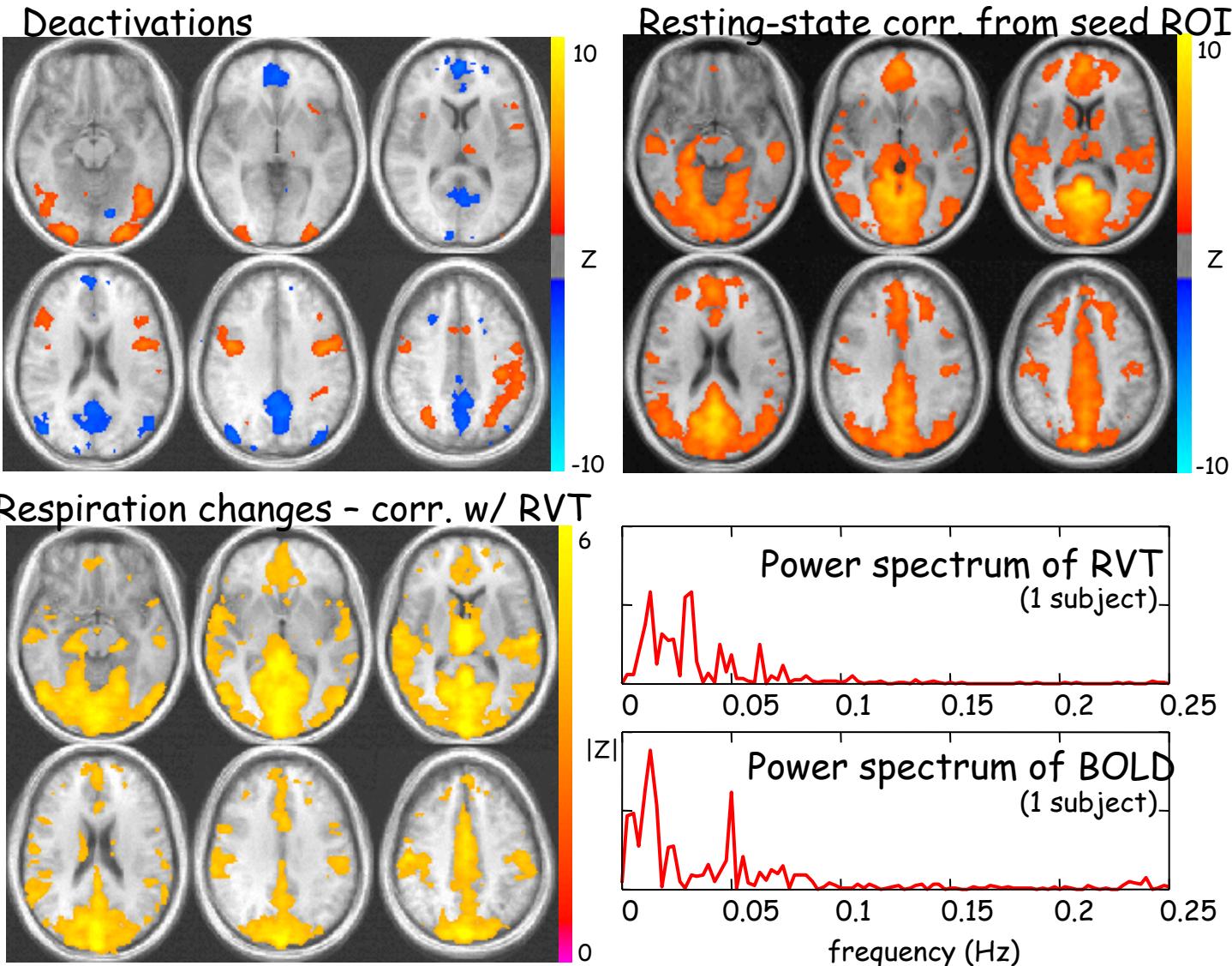


Power spectrum of BOLD



# Respiration related

## RVT changes co-localize



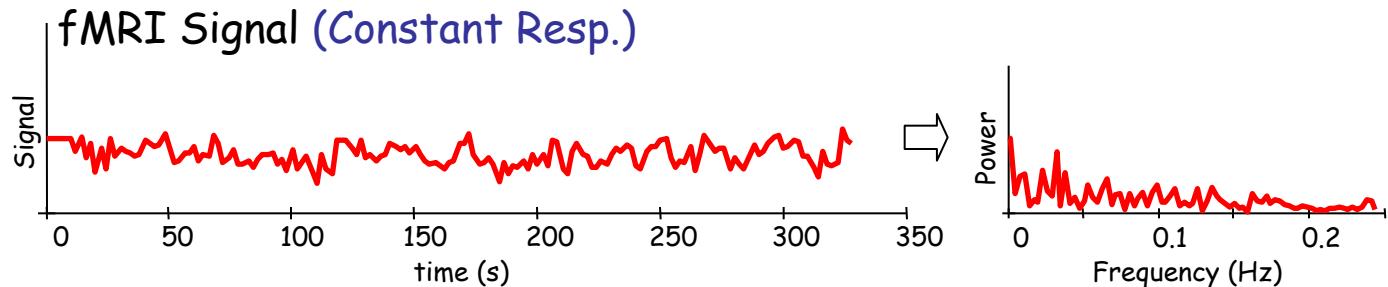
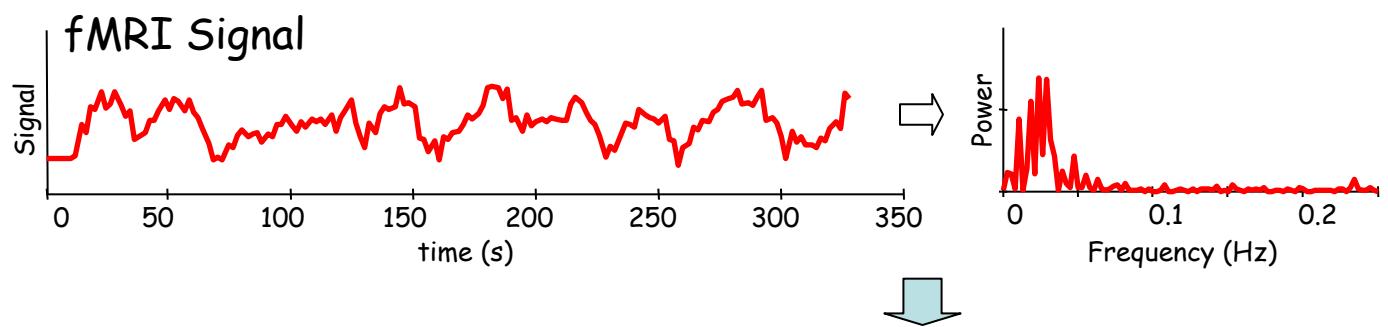
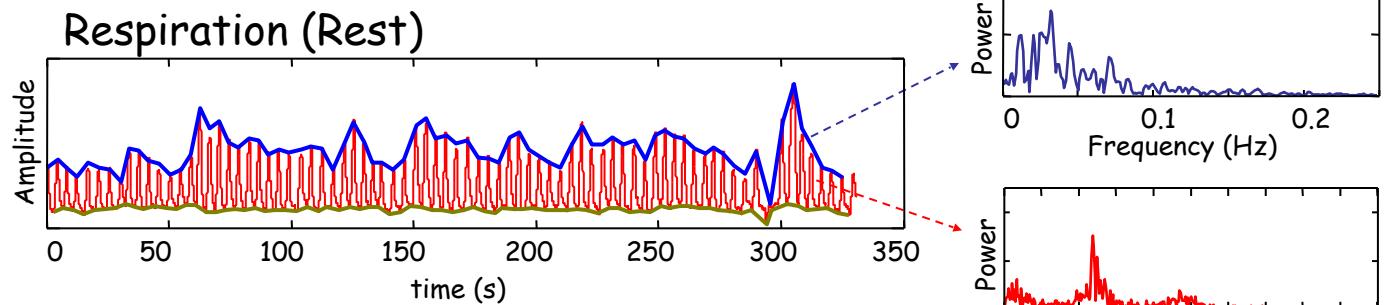
# Time series improvement

## Correcting for changes in respiration

- Regress out RVT
- Keep respirations constant

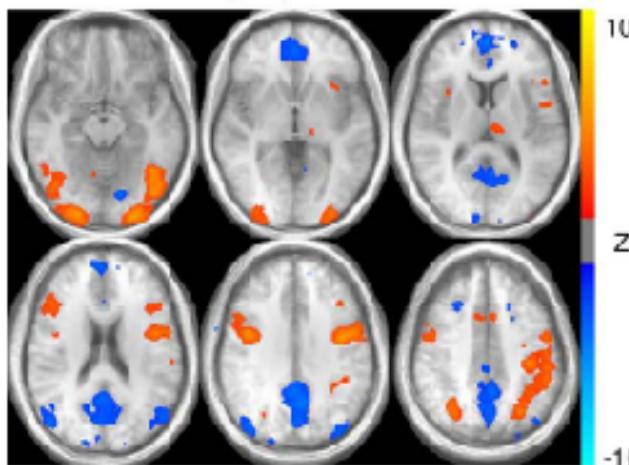
# Time series improvement

Cue subject to keep breathing constant

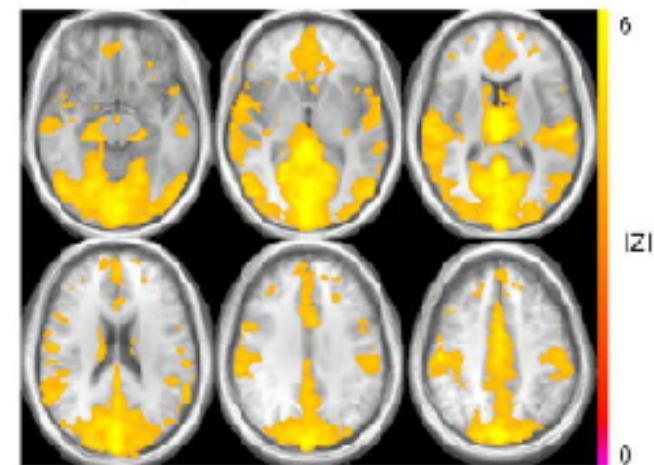


# Time series improvement

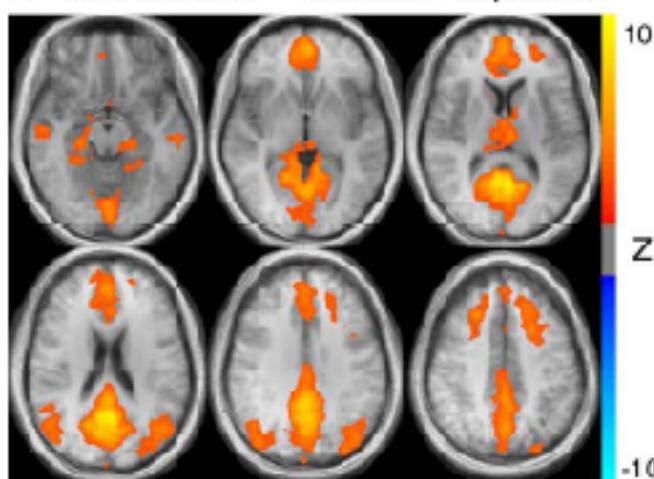
A Lexical task (de-) activation



B BOLD signal correlated with RVT



E Rest-state corr – Constant Respirations



# Technology

Coil arrays  
High field strength  
High resolution  
Novel functional contrast

# Methodology

Connectivity assessment  
Multi-modal integration  
Pattern classification  
Task design

Fluctuations  
Dynamics  
Cross - modal comparison

Basic Neuroscience  
Behavior correlation/prediction  
Pathology correlation

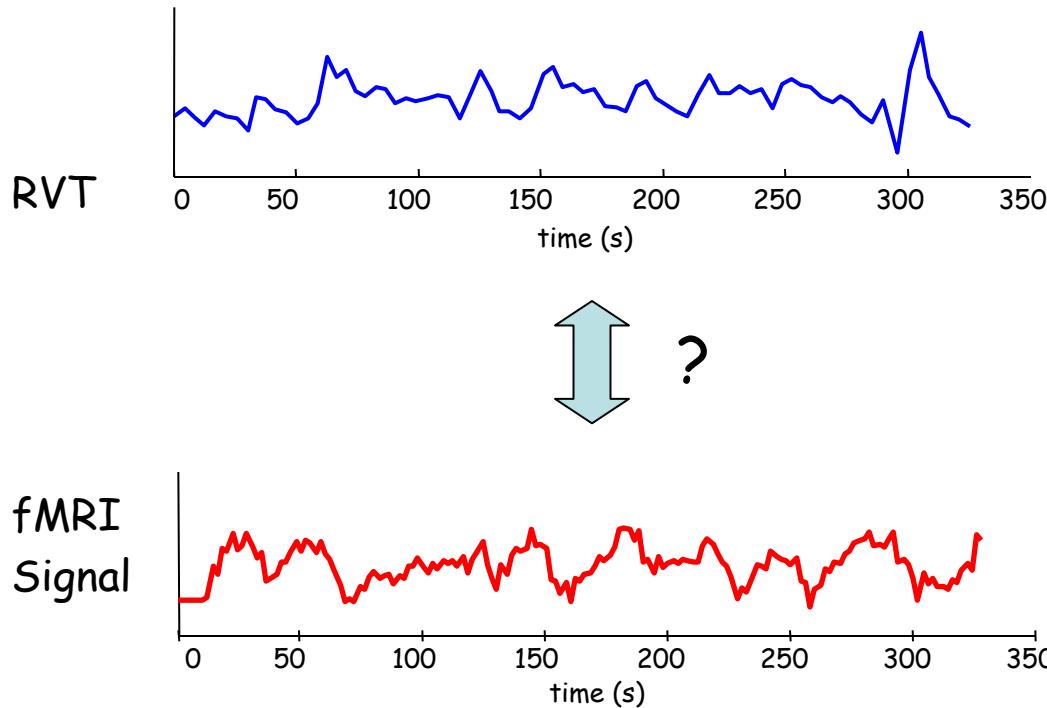
# Interpretation

# Applications

# Respiration Response Function

## Respiration Changes vs. BOLD

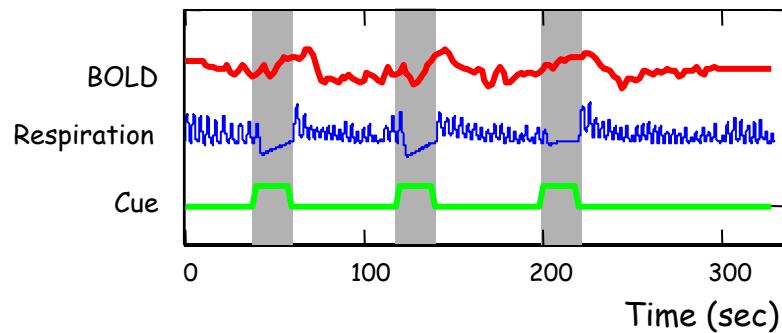
How are the BOLD changes related to respiration variations?



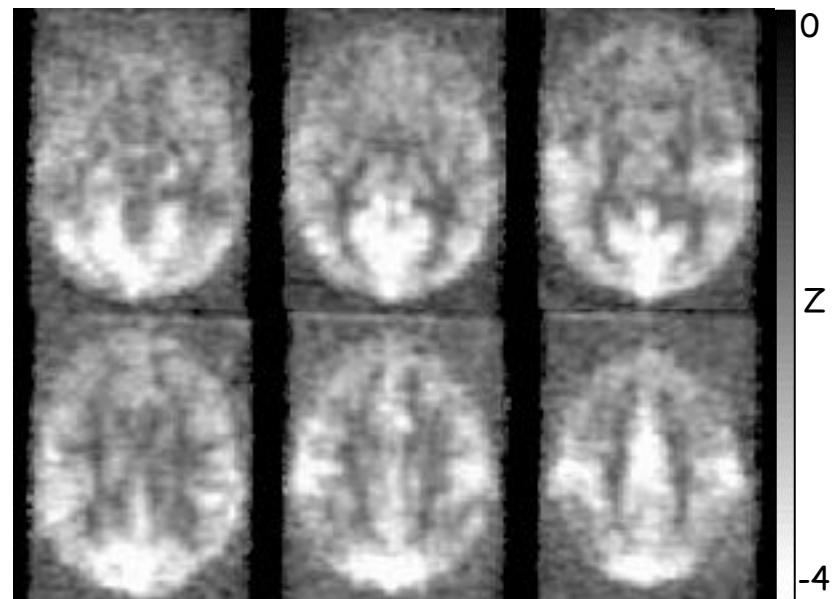
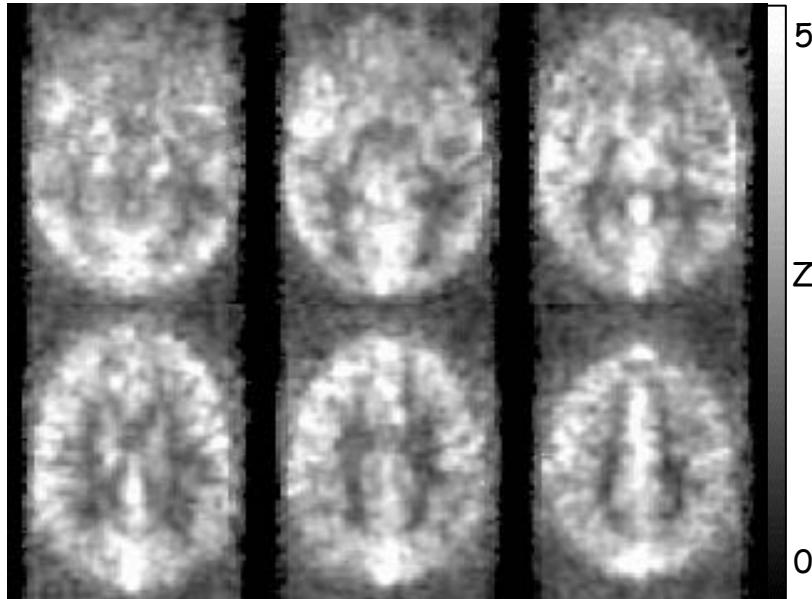
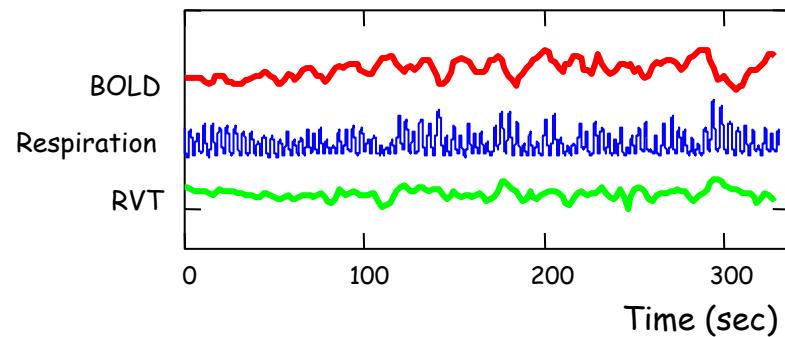
# Respiration Response Function

## Respiration induced signal changes

### Breath-holding



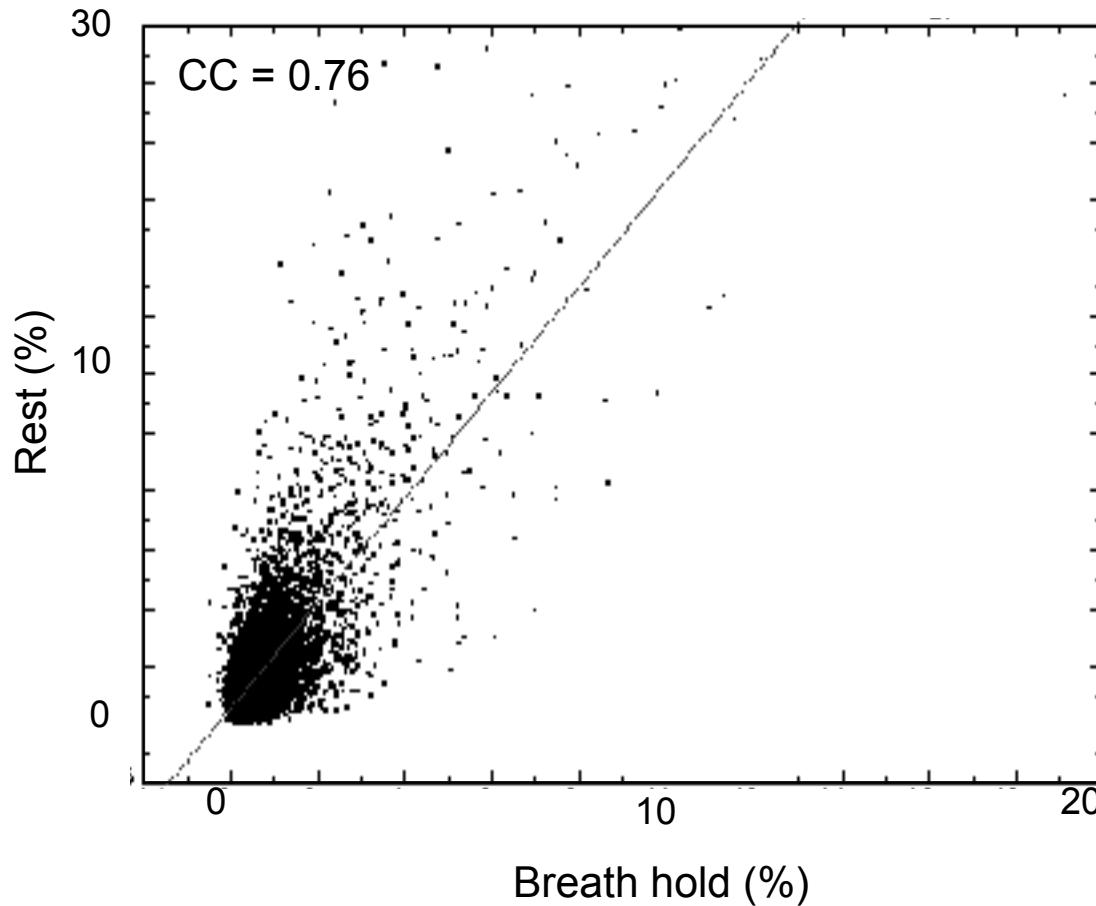
### Rest



# Respiration Response Function

Resting changes in breathing vs. Breath-holding

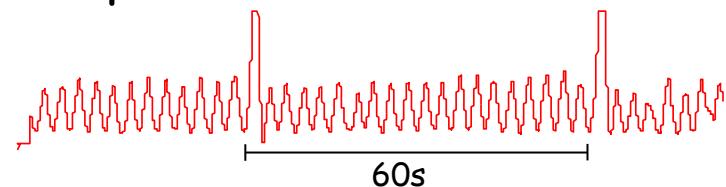
*Correlation with Respiration Volume / Time (RVT)*



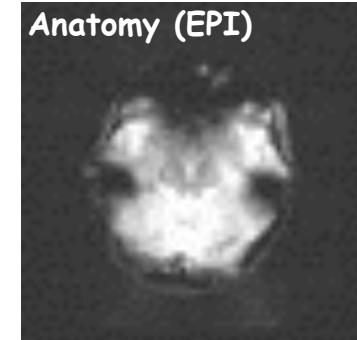
# Respiration Response Function

## fMRI response to a single Deep Breath

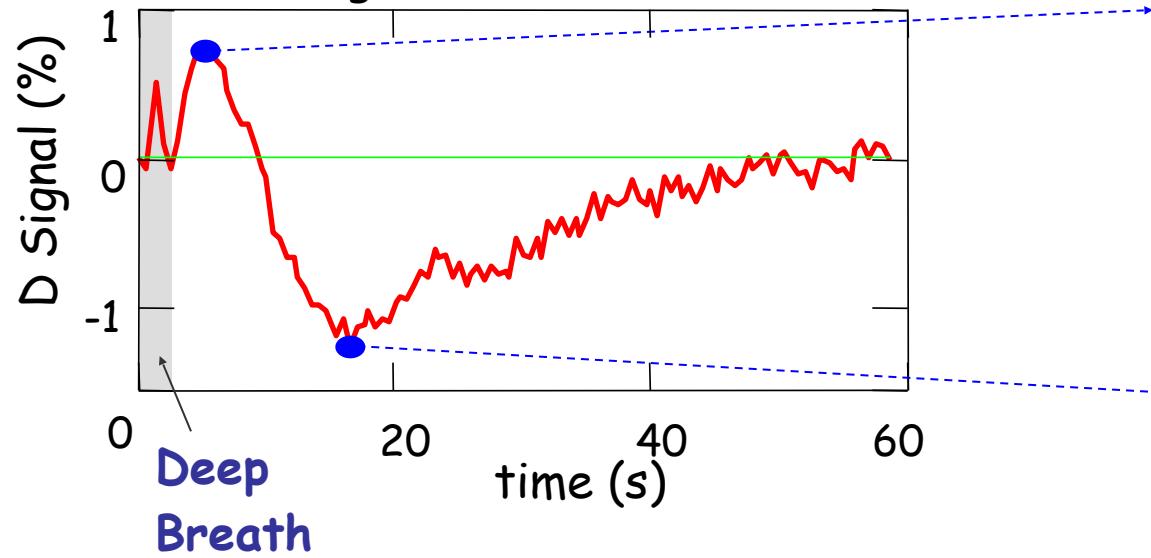
Respiration



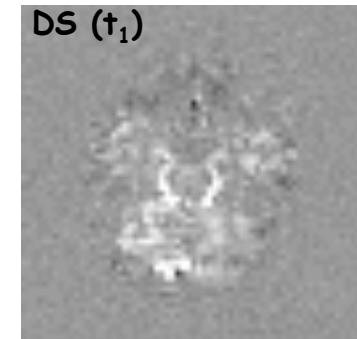
Anatomy (EPI)



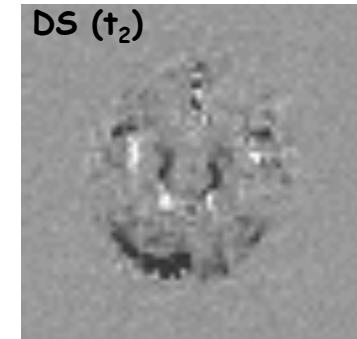
fMRI Signal



DS ( $t_1$ )

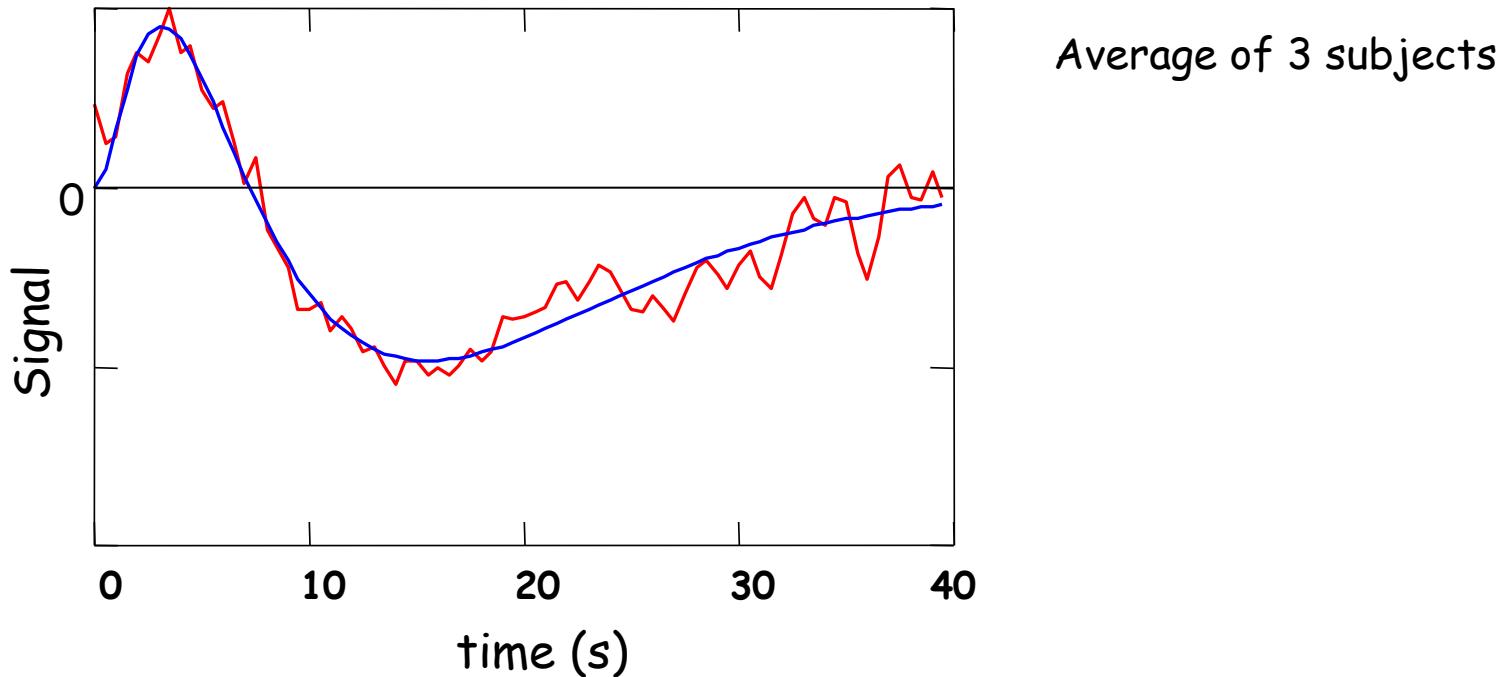


DS ( $t_2$ )



## Respiration Response Function

# Respiration response function



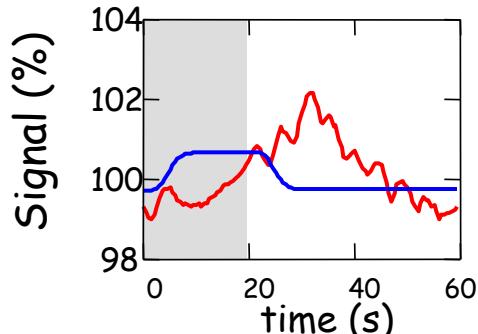
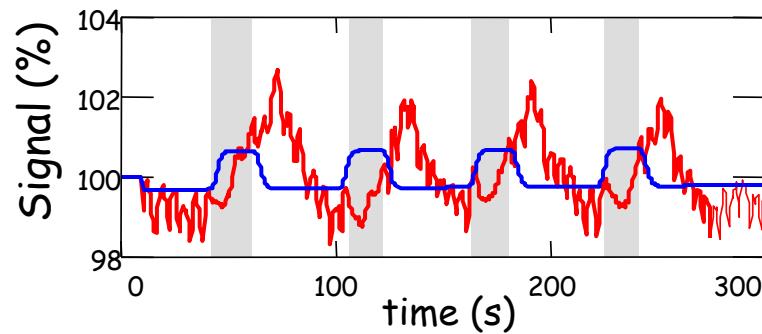
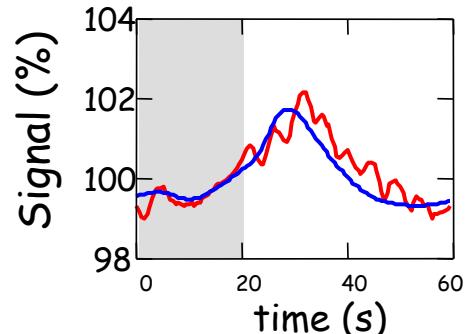
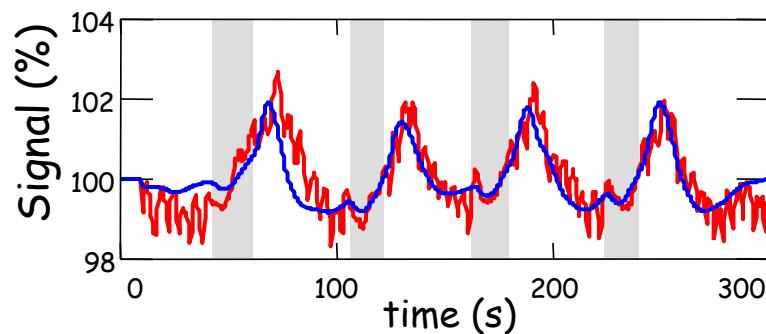
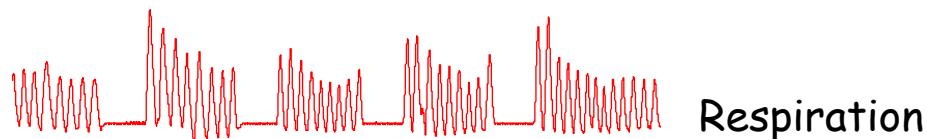
$$\text{RRF}(t) = 0.6 + t^{2.1} e^{-\frac{t}{1.6}} - 0.0023 t^{3.54} e^{-\frac{t}{4.25}}$$

# Respiration Response Function

fMRI response to breathing modulations

## Breath-holding

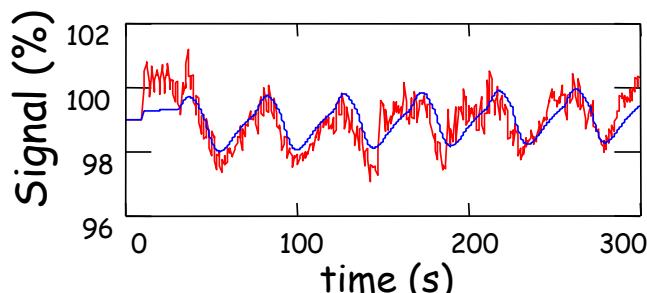
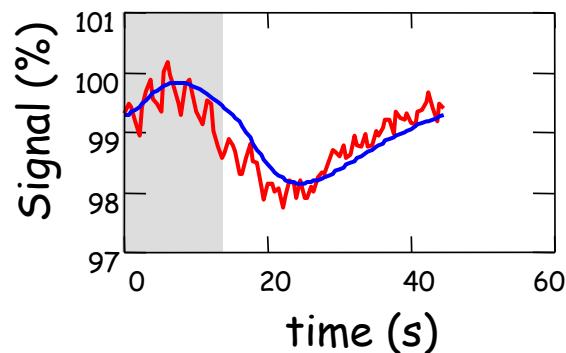
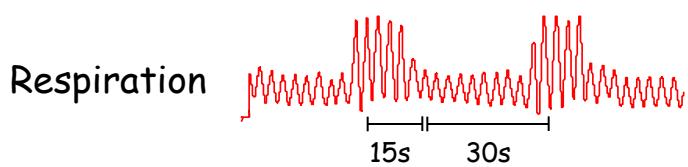
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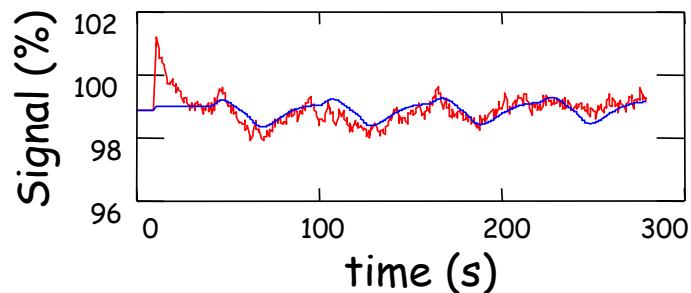
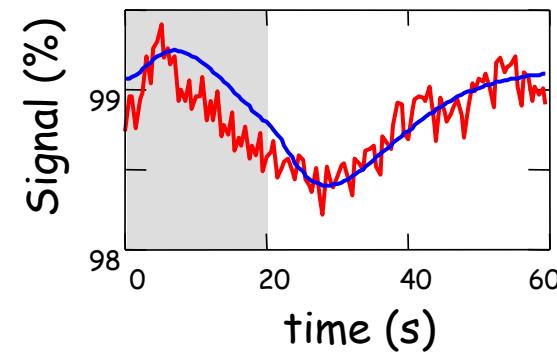
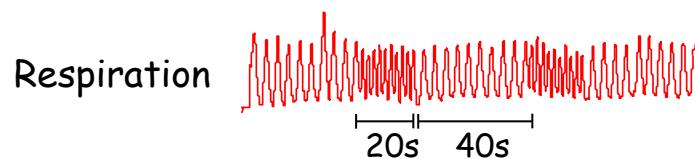
# Respiration Response Function

## fMRI response to breathing modulations

### Changes in Depth

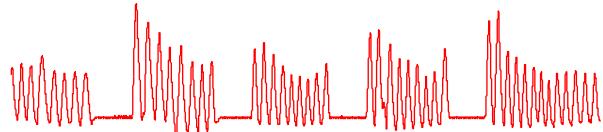


### Changes in Rate

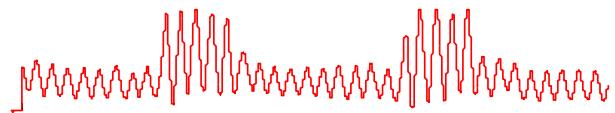


# Respiration Response Function

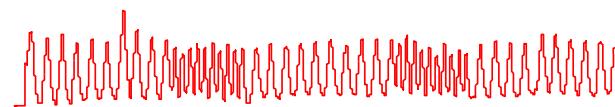
## Calibration using other respiration changes



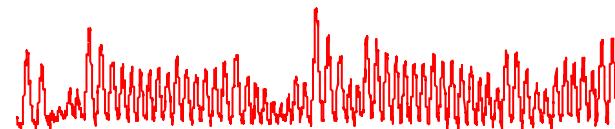
Breath-holding



Depth changes

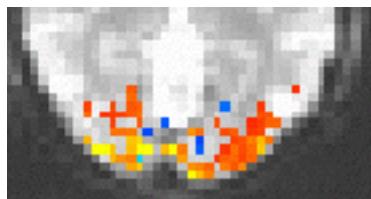


Rate changes



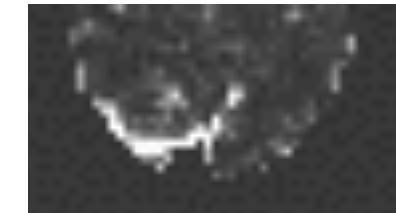
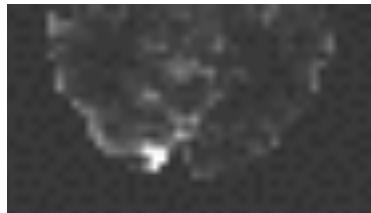
spontaneous fluctuations  
in respiration during rest

## Visual Activation

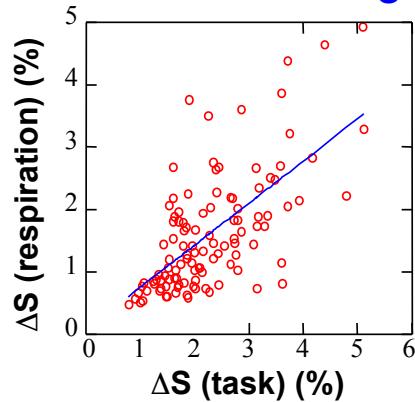


# Respiration Response Function

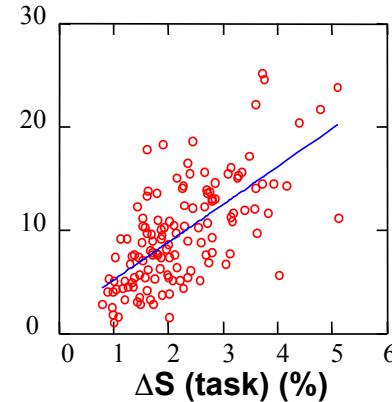
## Respiration – induced signal changes



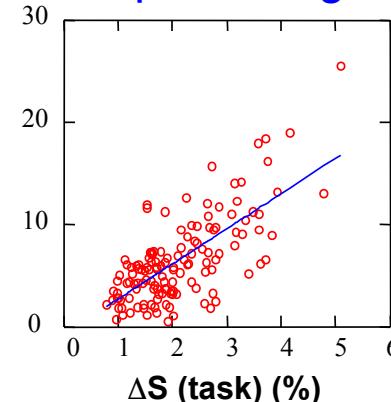
## Breath-holding



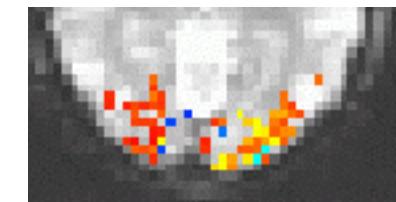
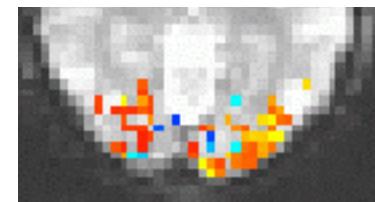
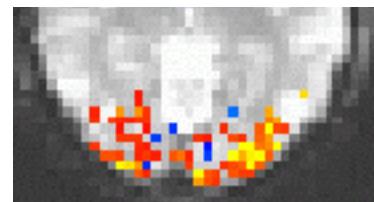
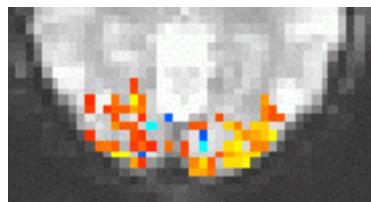
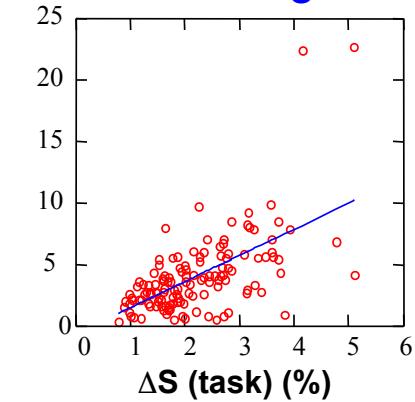
## Rest



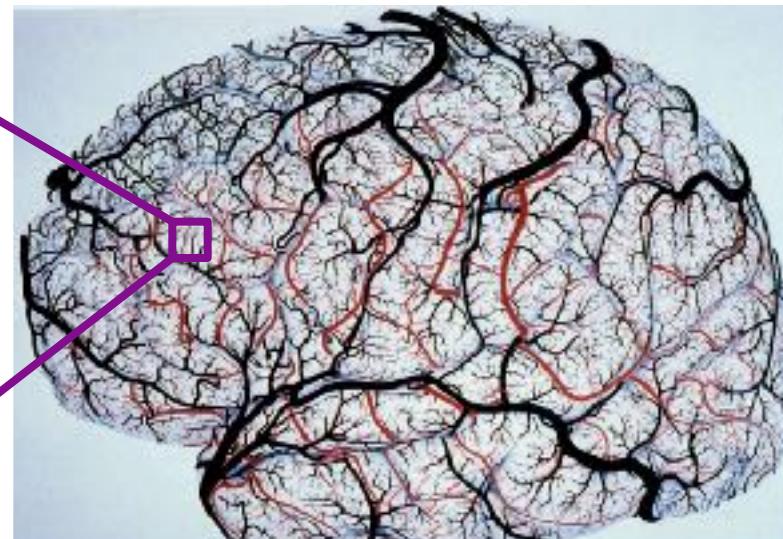
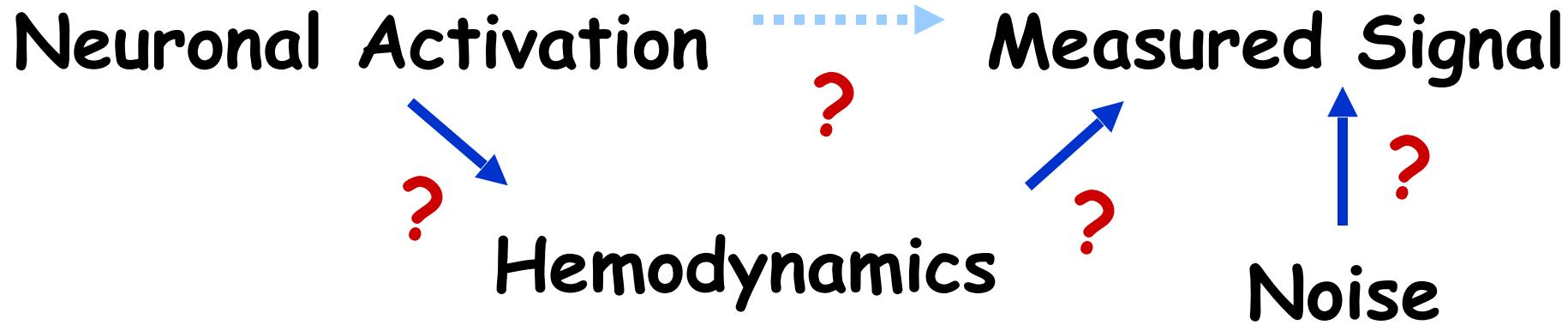
## Depth changes



## Rate changes



# Interpretation

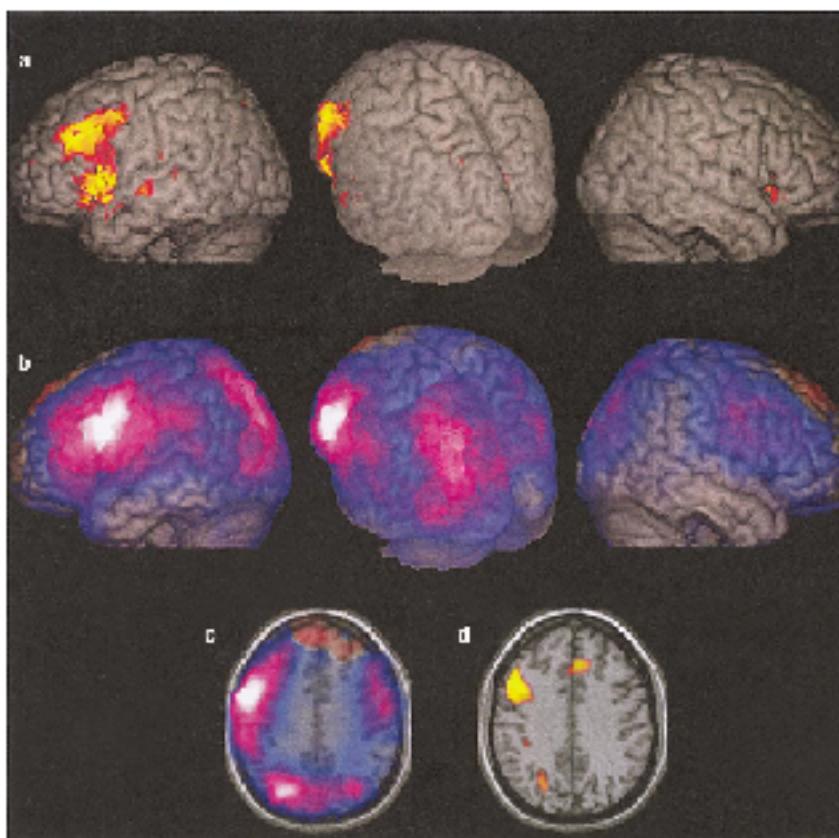


## Task-Related Changes in Cortical Synchronization Are Spatially Coincident with the Hemodynamic Response

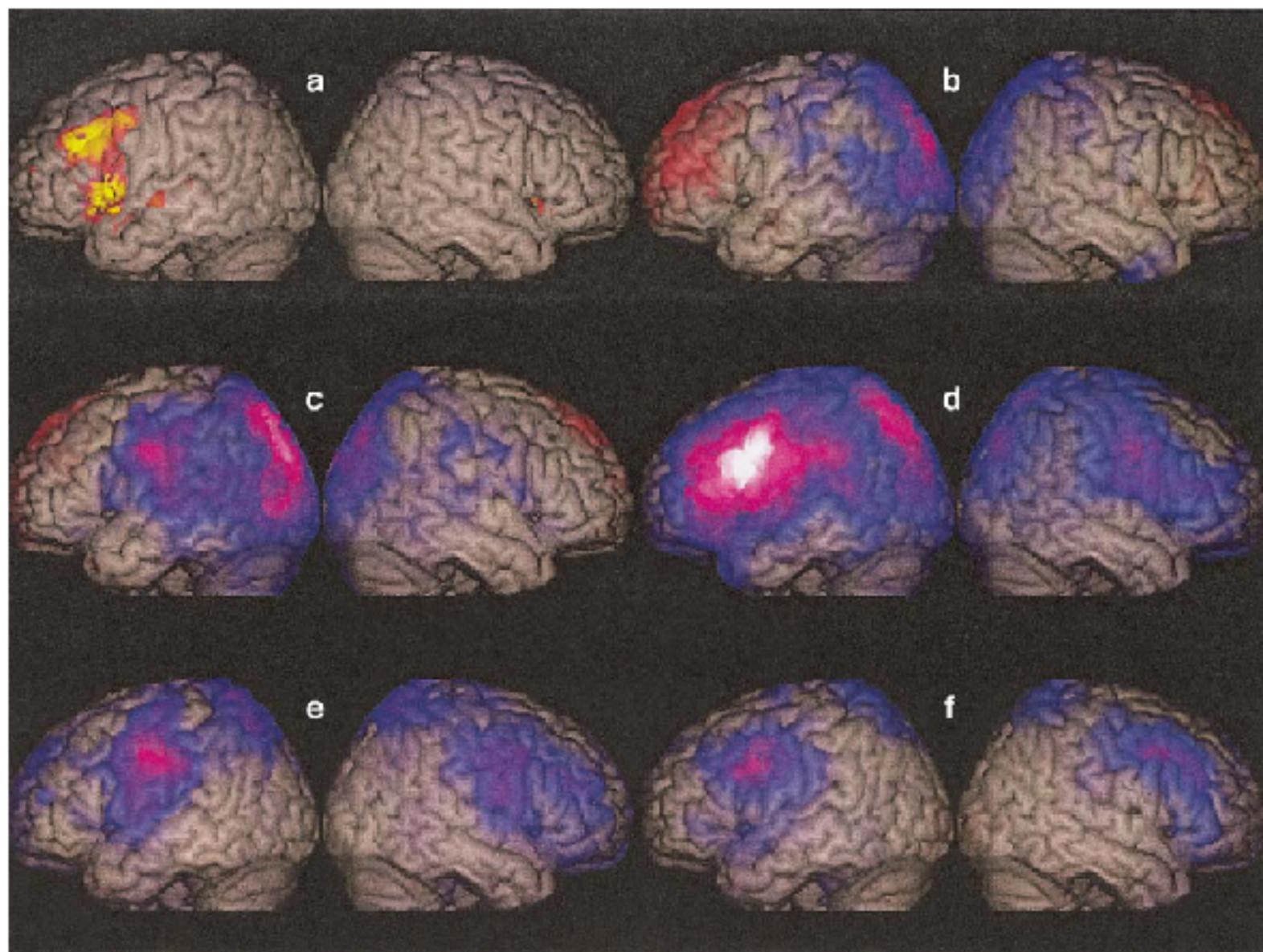
Kritish D. Singh,<sup>\*†‡</sup> Gareth R. Barnes,<sup>\*</sup> Arjan Hillenbrand,<sup>\*</sup> Einer M. E. Purde,<sup>\*</sup> and Adrian L. Williams<sup>§</sup>

<sup>\*</sup>The Wellcome Trust Laboratory for MEG Studies, Neurosciences Research Institute, Aston University, Birmingham, United Kingdom;

<sup>†</sup>MRIARC, Liverpool University, Liverpool, United Kingdom; <sup>‡</sup> Walton Centre for Neurology and Neurosurgery, Liverpool, United Kingdom; and <sup>§</sup>Department of Psychology, Royal Holloway, University of London, Egham, United Kingdom



**FIG. 2.** Results of the group fMRI experiment and the group MEG experiment for the face naming task superimposed on a standard brain. The color scales are as described in the legend of Fig. 1. (a) Group fMRI data. Only those clusters significant at  $P < 0.05$  (corrected) are shown. (b) The peak group fMRI image. This shows the peak cluster from a random selection of voxels in the face naming region of which there were very many during the passive viewing condition. This image is on the same brain as an example of Figs. 1(a)–(c). (c) The peak group fMRI data superimposed on a slice through the complete brain at an MNI  $Z$  coordinate of +12. (d) Image shows bilateral, but strongly left lateral, activation within the dorsolateral prefrontal cortex (DLPFC) and posterior parietal cortex. (d) The group fMRI data superimposed on the  $Z = +35$  slice. Note the left DLPFC and left posterior parietal activation which match the group fMRI results. However, there is also a small cluster in the anterior portion of the prefrontal lobe and a cluster in the medial frontal gyrus which are visible in the group fMRI data but not in the group MEG data.



**FIG. 1.** The results of the group fMRI experiment and the group MEG experiment for the covert letter fluency task, superimposed on a template brain. (a) Group fMRI data. Only those clusters significant at  $P < 0.05$  (corrected) are shown. The red-orange-yellow color scale depicts increasing BOLD amplitude. (b-f) The results of the group SAM analysis of the MEG data. Increases in signal power in the Active phase, compared to the Passive baseline are shown using a red-orange-yellow color scale. Decreases in signal power in the Active phase are shown using a blue-purple-white color scale. The power changes are in the following frequency bands (b) 1–10 Hz; (c) 5–15 Hz; (d) 15–25 Hz; (e) 25–35 Hz; and (f) 35–45 Hz.

# Technology

Coil arrays  
High field strength  
High resolution  
Novel functional contrast

# Methodology

Connectivity assessment  
Multi-modal integration  
Pattern classification  
Task design

Fluctuations  
Dynamics  
Cross - modal comparison

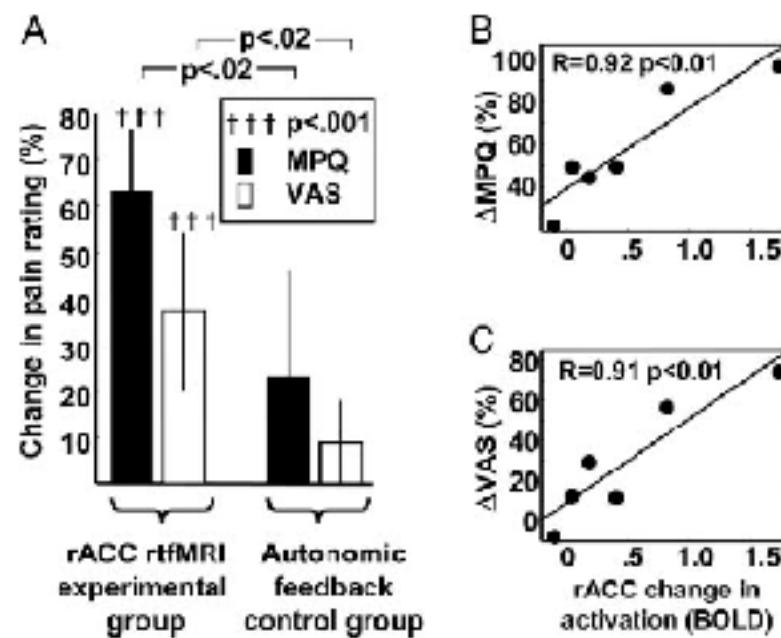
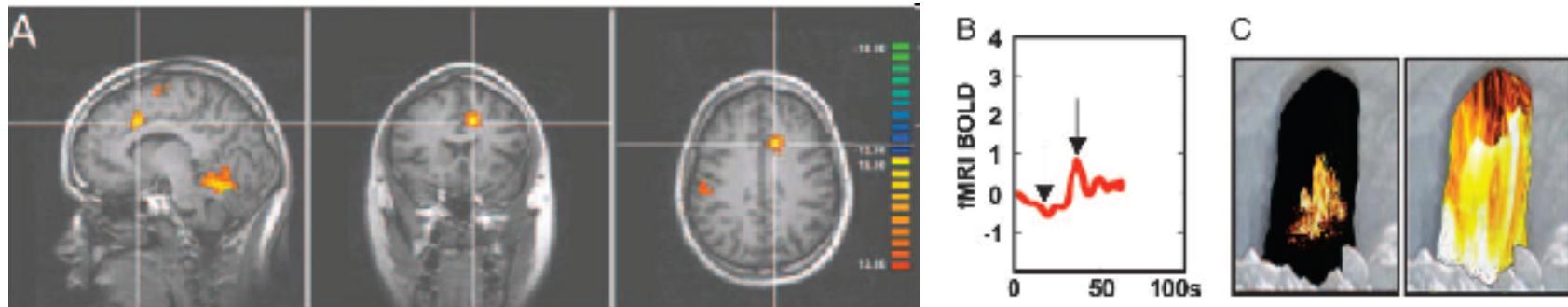
Basic Neuroscience  
Behavior correlation/prediction  
Pathology correlation

# Interpretation

# Applications

# Applications

## Real time fMRI feedback to reduce chronic pain

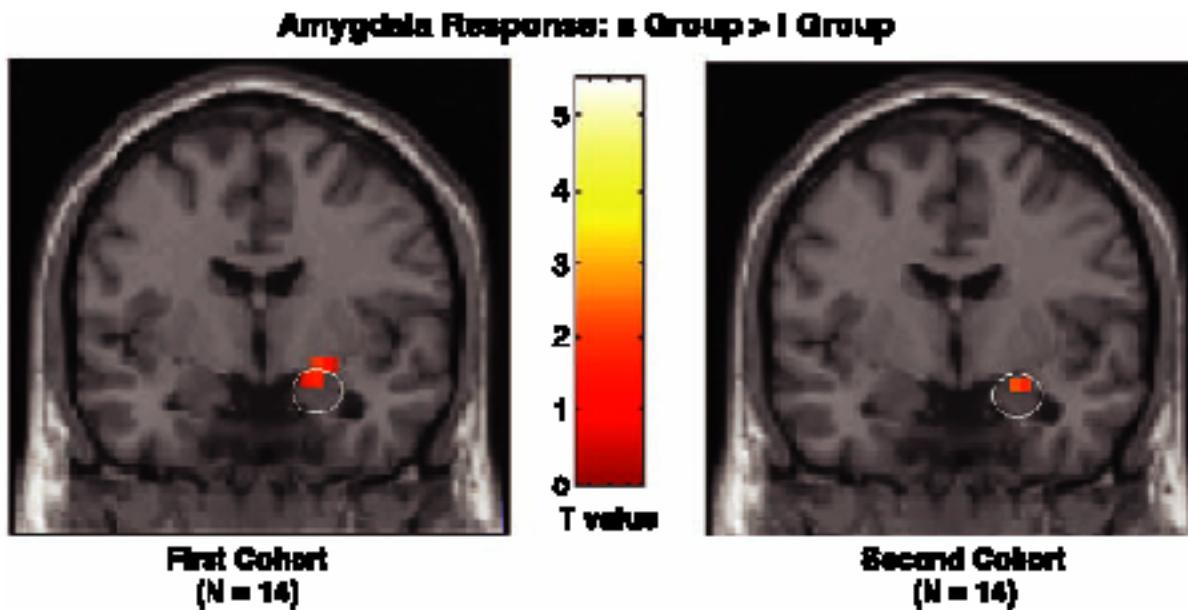


Control over brain activation and pain learned by using real-time functional MRI, R. C. deCharms, et al. PNAS, 102; 18626-18631 (2005)

Comparison of two groups of normal individuals with differences in the Serotonin Transporter Gene

# Serotonin Transporter Genetic Variation and the Response of the Human Amygdala

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# What fMRI Can Do

## Understanding normal brain organization and changes

- networks involved with specific tasks (low to high level processing)
- changes over time (seconds to years)
- correlates of behavior (response accuracy, performance changes...)

## Clinical research

- correlates of specifically activated networks to clinical populations
- presurgical mapping

# What fMRI Might Do

## Complementary use for clinical diagnosis

- utilization of clinical research results
- prediction of pathology

## Clinical treatment and assessment

- drug, therapy, rehabilitation, biofeedback
- epileptic foci mapping
- drug effects

## Non clinical uses

- complementary use with behavioral, anatomical, other modality results
- lie detection
- prediction of behavior tendencies
- brain/computer interface