

# The Biggest Unknowns in Functional MRI

Peter A. Bandettini, Ph.D

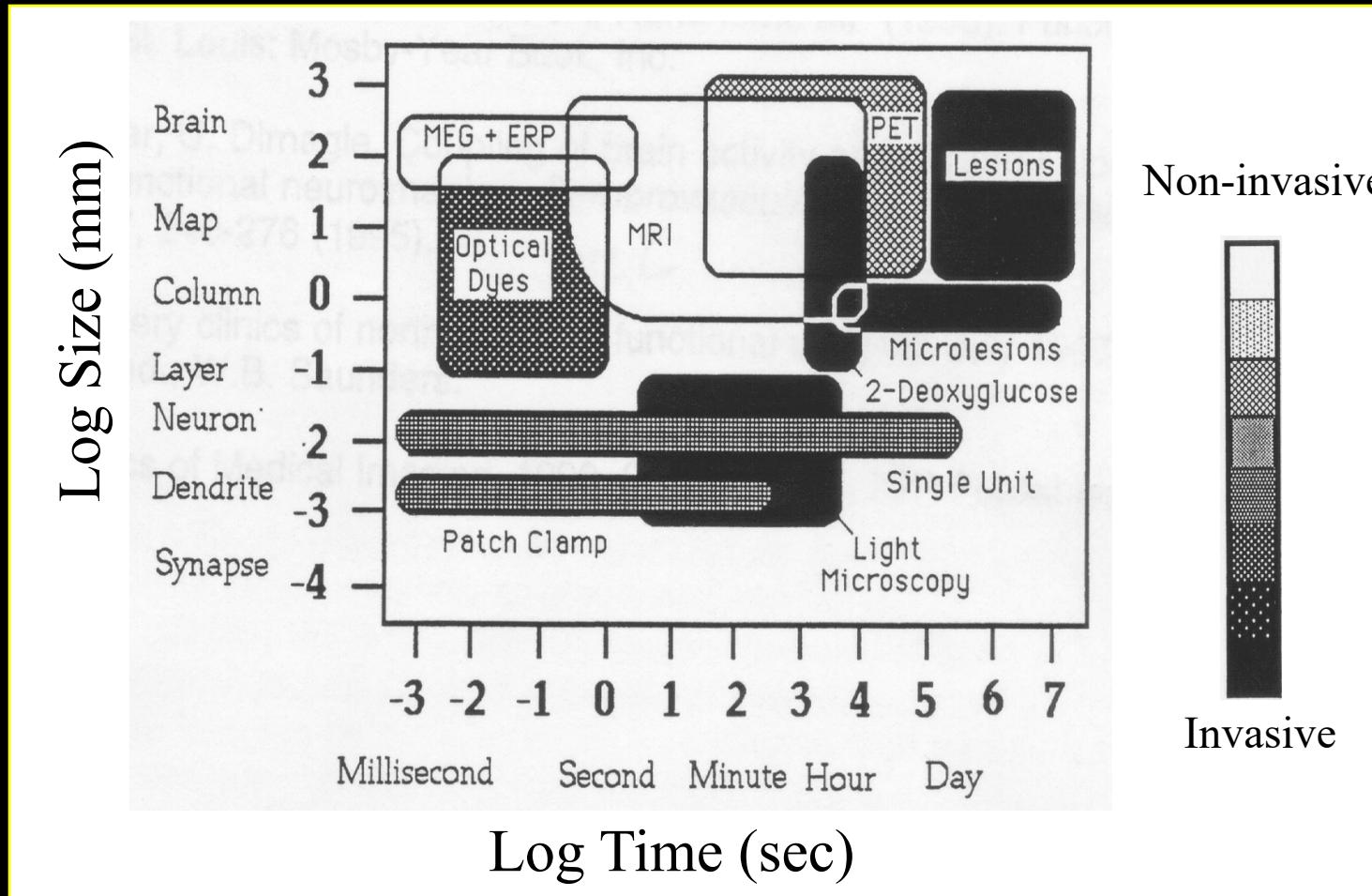
[bandettini@nih.gov](mailto:bandettini@nih.gov)

Unit on Functional Imaging Methods  
&  
Functional MRI Facility

Laboratory of Brain and Cognition  
National Institute of Mental Health

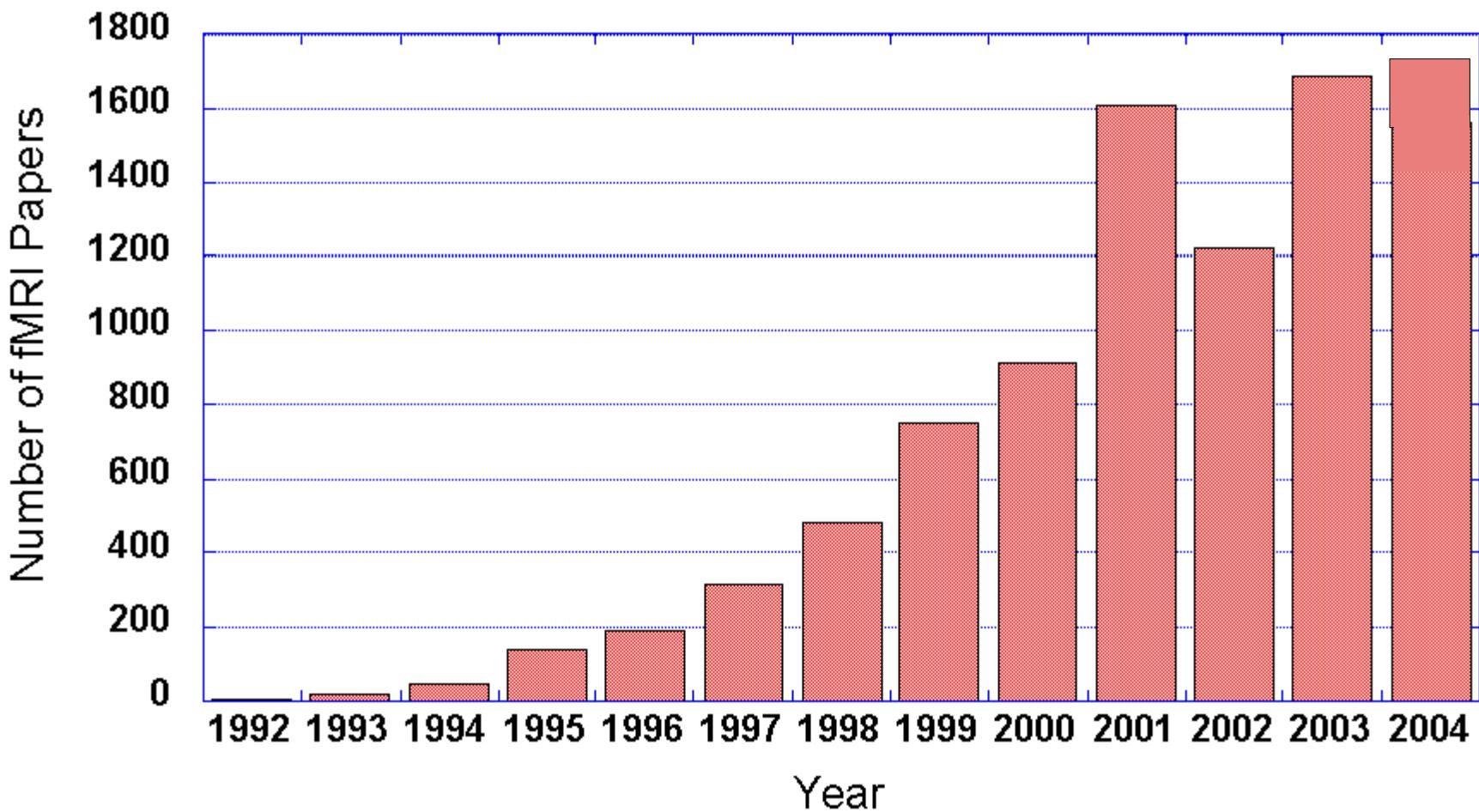


# Functional Neuroimaging Techniques

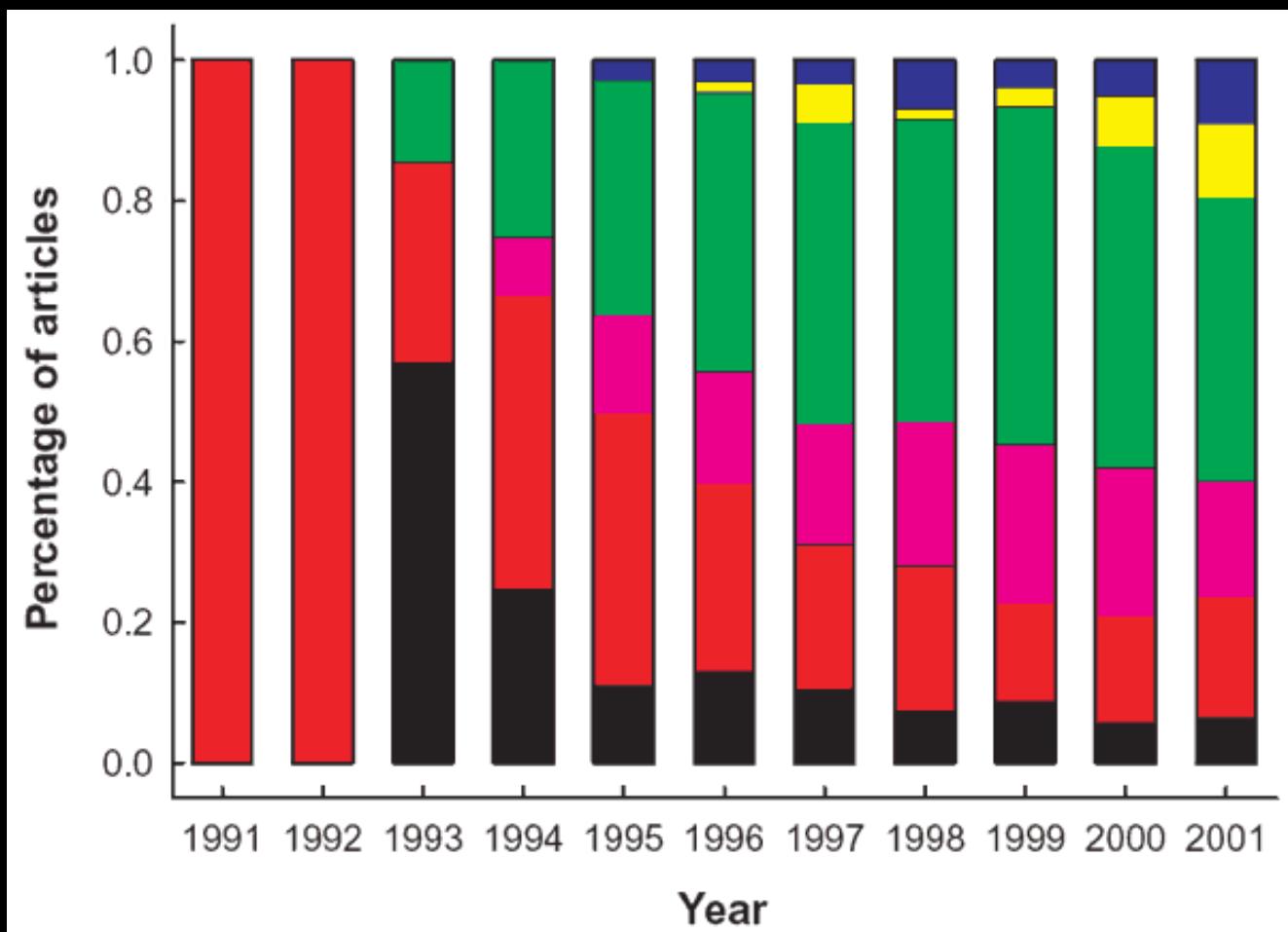




## Functional MRI Papers Published per Year



## Type of fMRI research performed



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

# Uses

## 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

## Future Uses

### 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

Technology

Methodology

Engineering

Physics

Computer  
Science

Statistics

Cognitive  
Science

Neuroscience

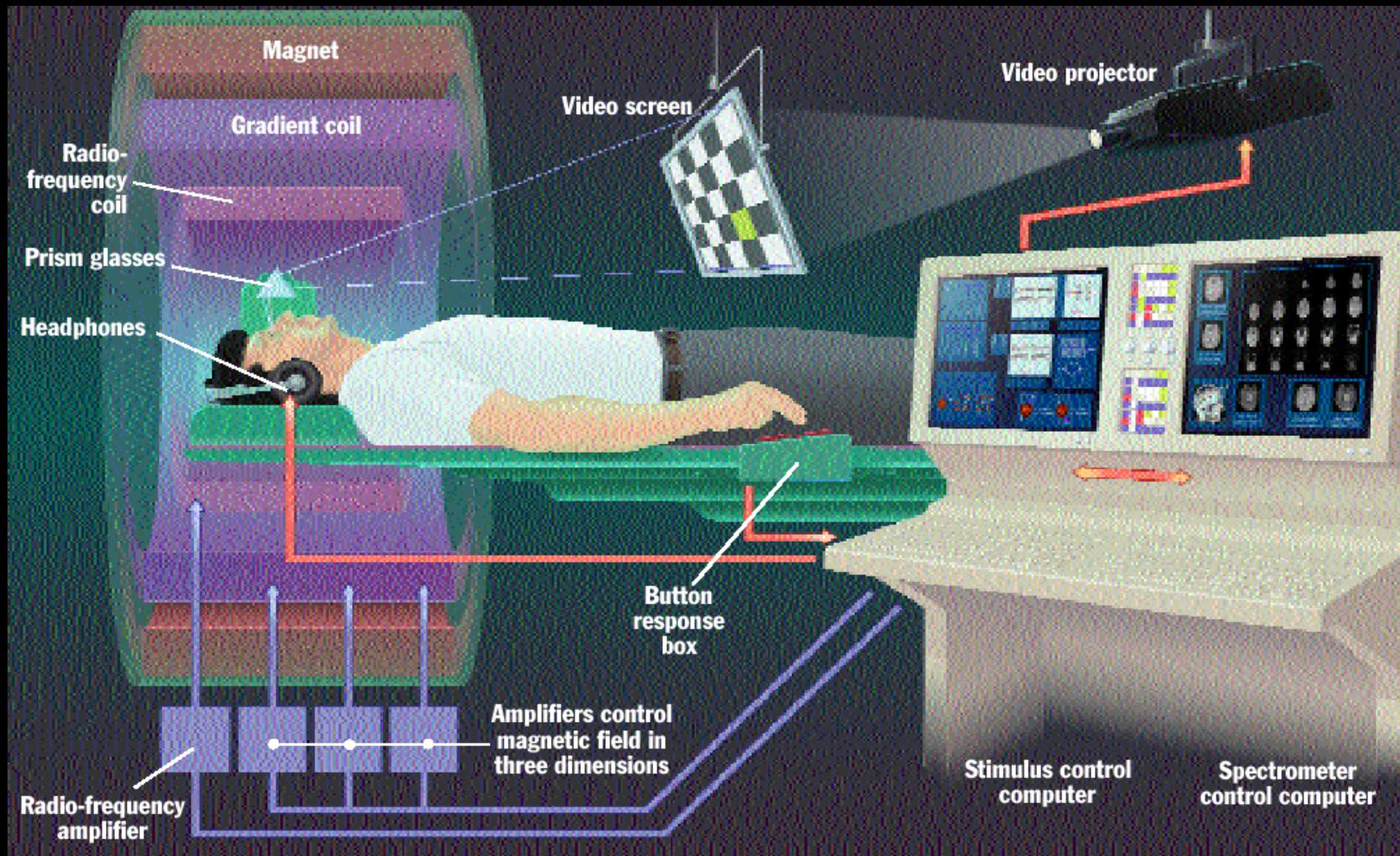
Physiology

Medicine

Interpretation

Applications

# fMRI Setup



Courtesy, Robert Cox,  
Scientific and Statistical  
Computing Core Facility,  
NIMH



# MRI vs. fMRI

high resolution  
(1 mm)

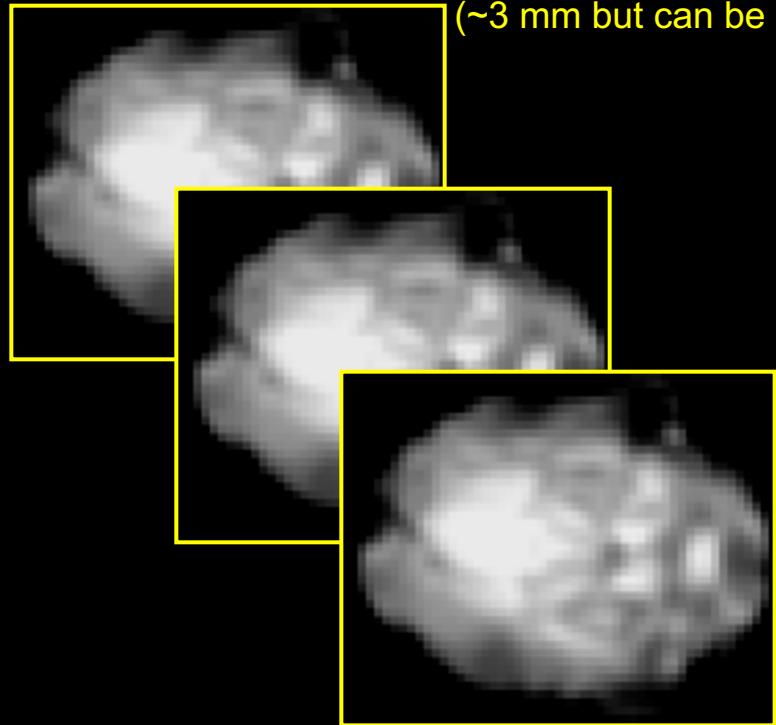
MRI



one image

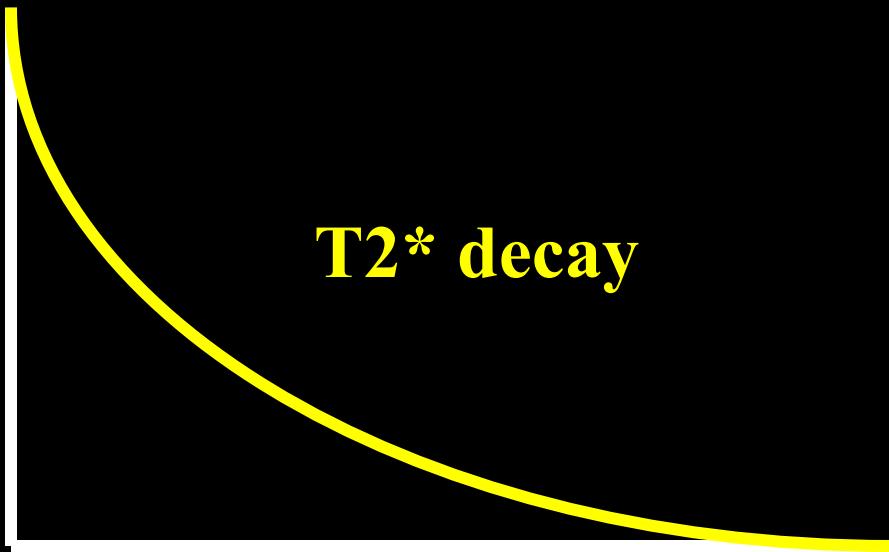
fMRI

low resolution  
(~3 mm but can be better)



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

# Single Shot EPI

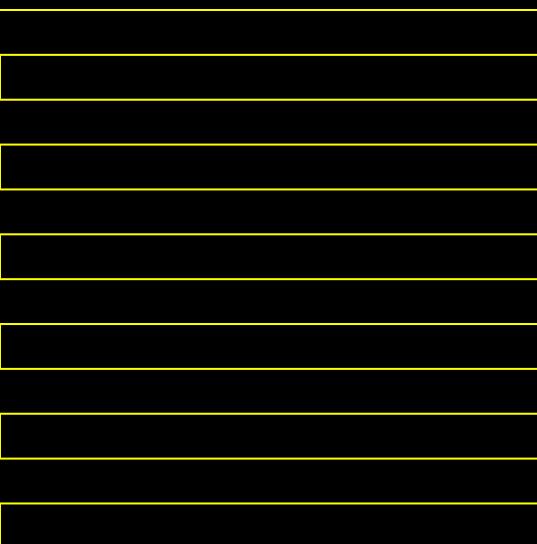
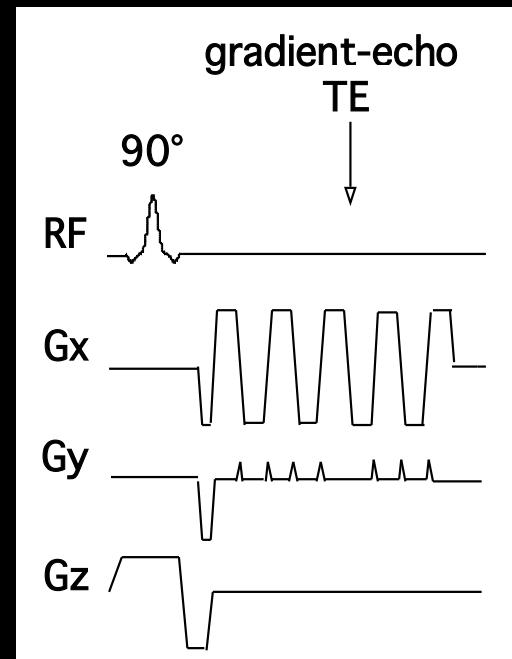


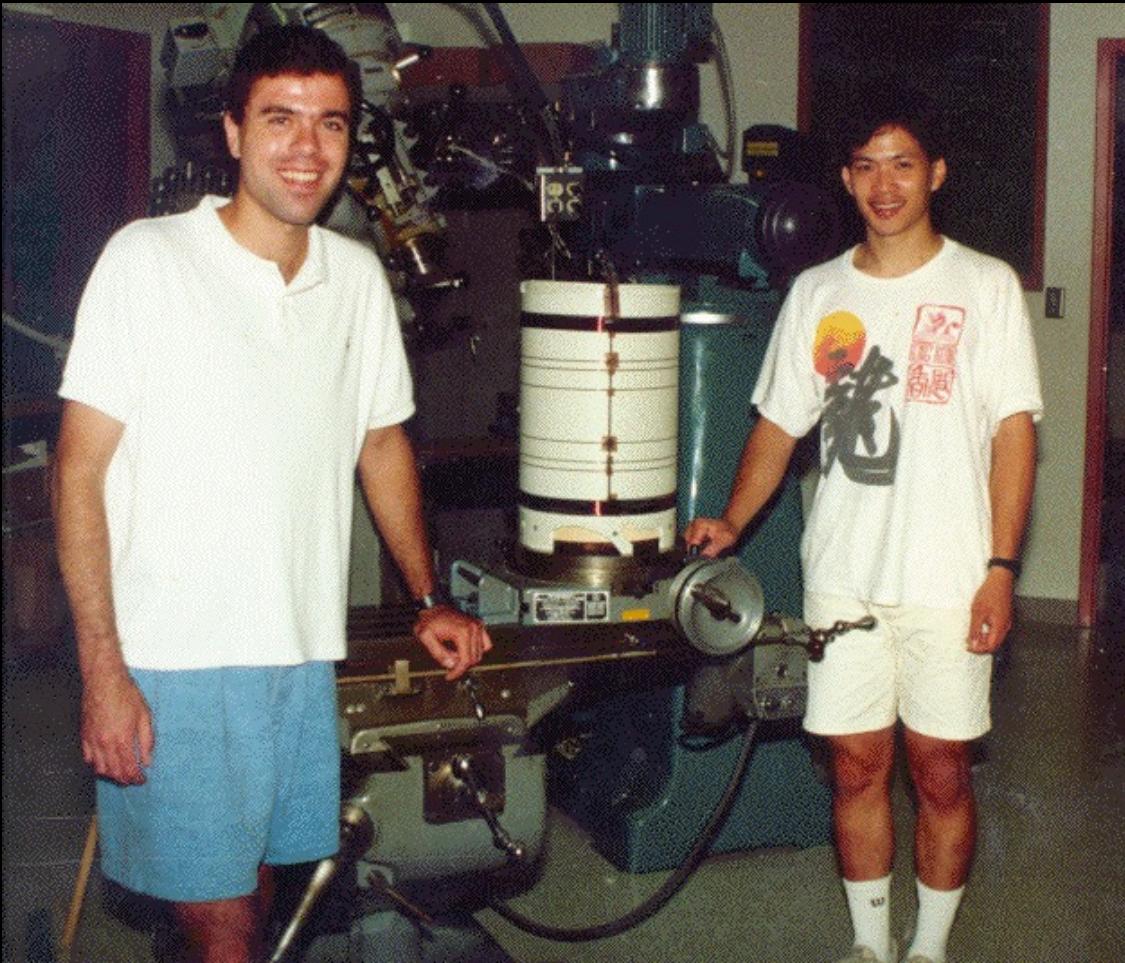
**T2\* decay**



EPI Readout Window

**$\approx 20$  to 40 ms**





August, 1991

**1991-1992**



**1992-1999**







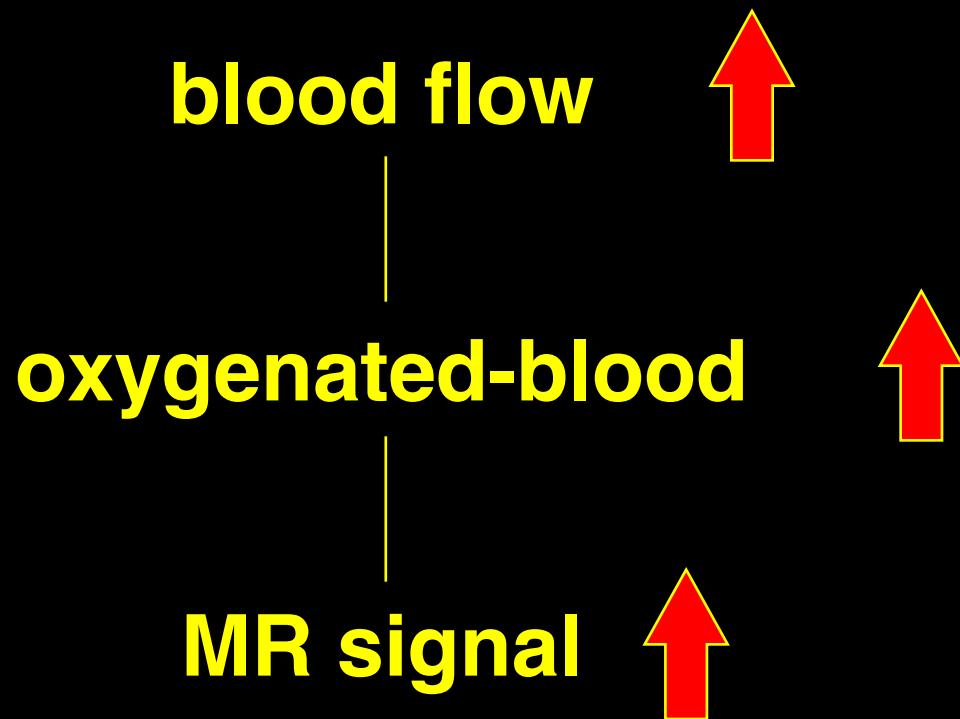
# General Electric 3 Tesla Scanner



# BOLD

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(blood oxygenation level dependence)



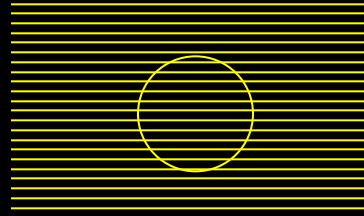
# Blood Oxygenation Imaging

*Oxygenated and deoxygenated red blood cells have different magnetic properties*

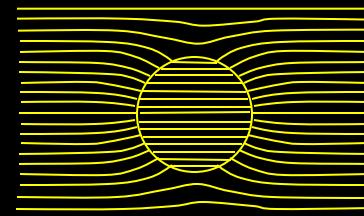


red blood cells

oxygenated



deoxygenated

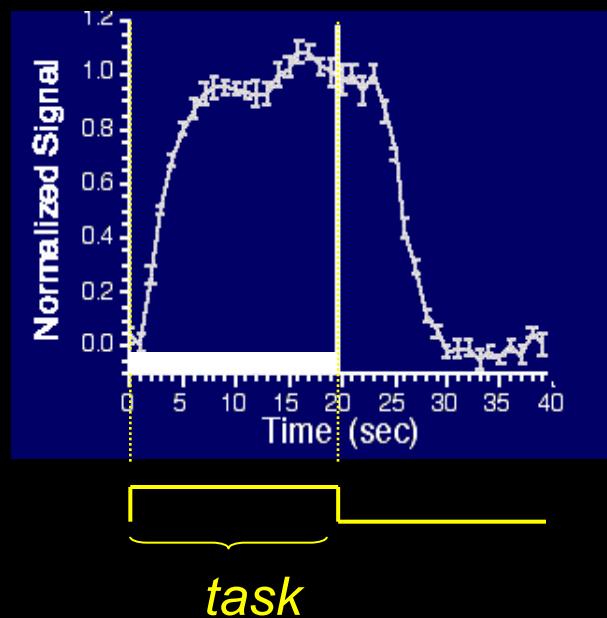


L. Pauling, C. D. Coryell, *Proc.Natl. Acad. Sci. USA* 22, 210-216, **1936**.

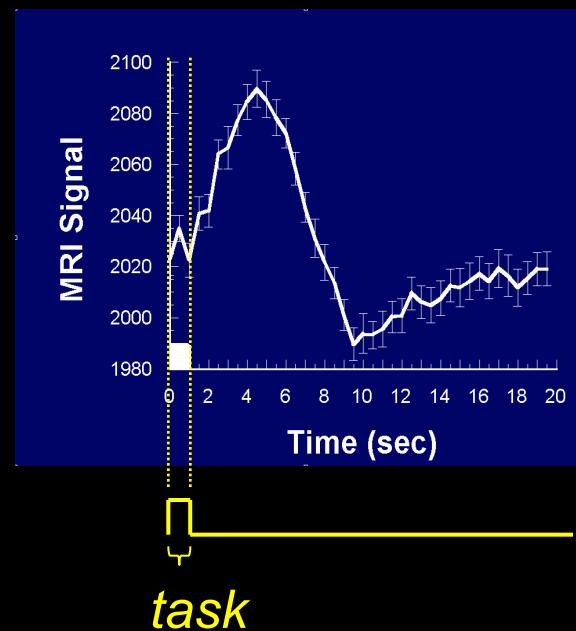
K.R. Thulborn, J. C. Waterton, et al., *Biochim. Biophys. Acta.* 714: 265-270, **1982**.

S. Ogawa, T. M. Lee, A. R. Kay, D. W. Tank, *Proc. Natl. Acad. Sci. USA* 87, 9868-9872, **1990**.

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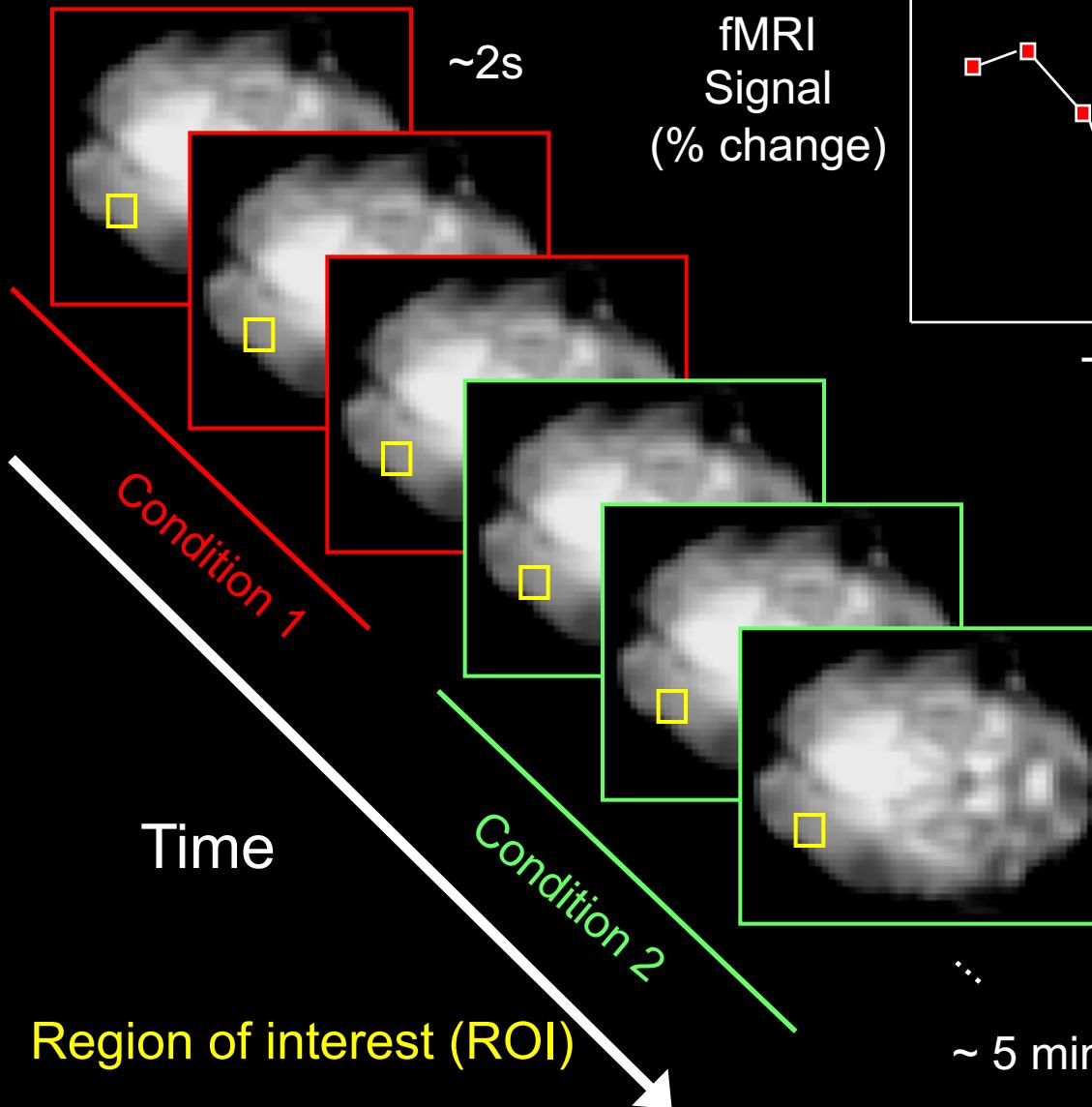


- K. K. Kwong, et al, (1992) “Dynamic magnetic resonance imaging of human brain activity during primary sensory stimulation.” Proc. Natl. Acad. Sci. USA. 89, 5675-5679.
- S. Ogawa, et al., (1992) “Intrinsic signal changes accompanying sensory stimulation: functional brain mapping with magnetic resonance imaging. Proc. Natl. Acad. Sci. USA.” 89, 5951-5955.
- P. A. Bandettini, et al., (1992) “Time course EPI of human brain function during task activation.” Magn. Reson. Med 25, 390-397.
- Blamire, A. M., et al. (1992). “Dynamic mapping of the human visual cortex by high-speed magnetic resonance imaging.” Proc. Natl. Acad. Sci. USA 89: 11069-11073.

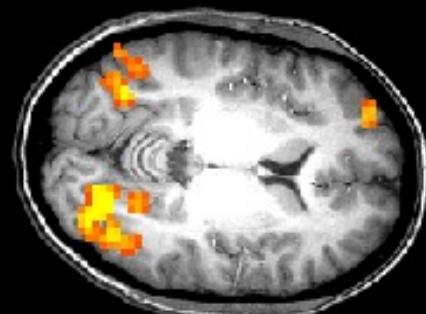


# Activation Statistics

Functional images

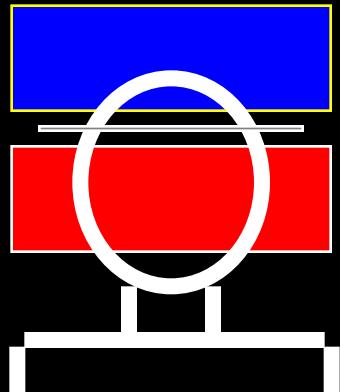


Statistical Map  
superimposed on  
anatomical MRI image

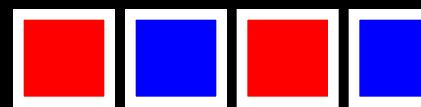
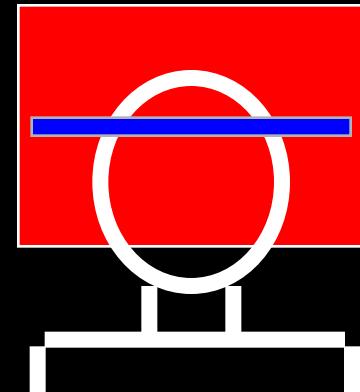


# Blood Perfusion Imaging

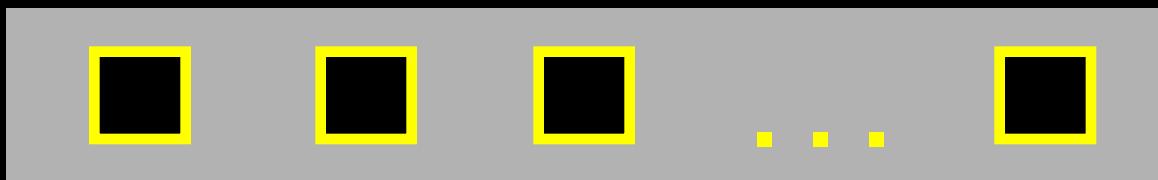
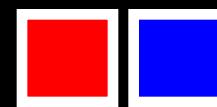
EPISTAR

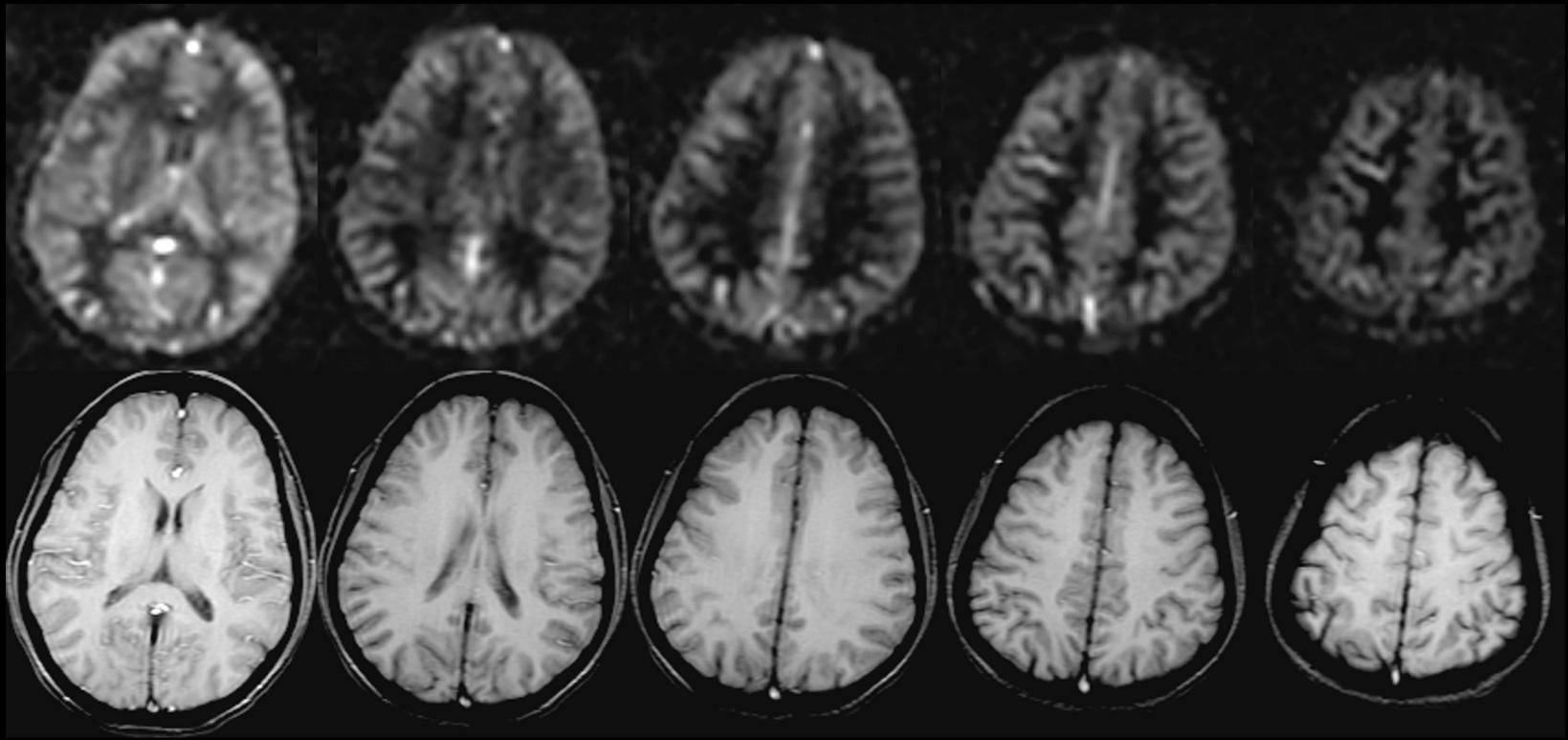


FAIR



...





Williams, D. S., Detre, J. A., Leigh, J. S. & Koretsky, A. S. (1992) "Magnetic resonance imaging of perfusion using spin-inversion of arterial water." Proc. Natl. Acad. Sci. USA 89, 212-216.

Edelman, R., Siewert, B. & Darby, D. (1994) "Qualitative mapping of cerebral blood flow and functional localization with echo planar MR imaging and signal targeting with alternating radiofrequency (EPISTAR)." Radiology 192, 1-8.

Kim, S.-G. (1995) "Quantification of relative cerebral blood flow change by flow-sensitive alternating inversion recovery (FAIR) technique: application to functional mapping." Magn. Reson. Med. 34, 293-301.

Kwong, K. K. et al. (1995) "MR perfusion studies with T1-weighted echo planar imaging." Magn. Reson. Med. 34, 878-887.

## Simultaneous BOLD and Perfusion



**BOLD**



**Perfusion**



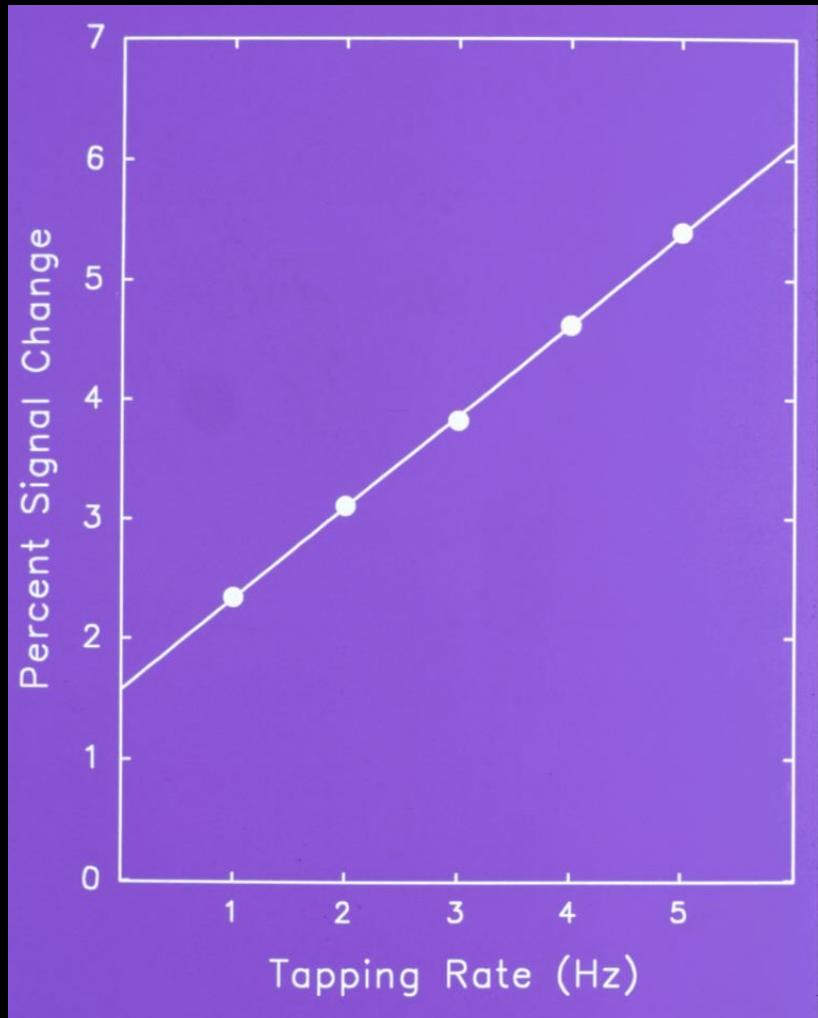
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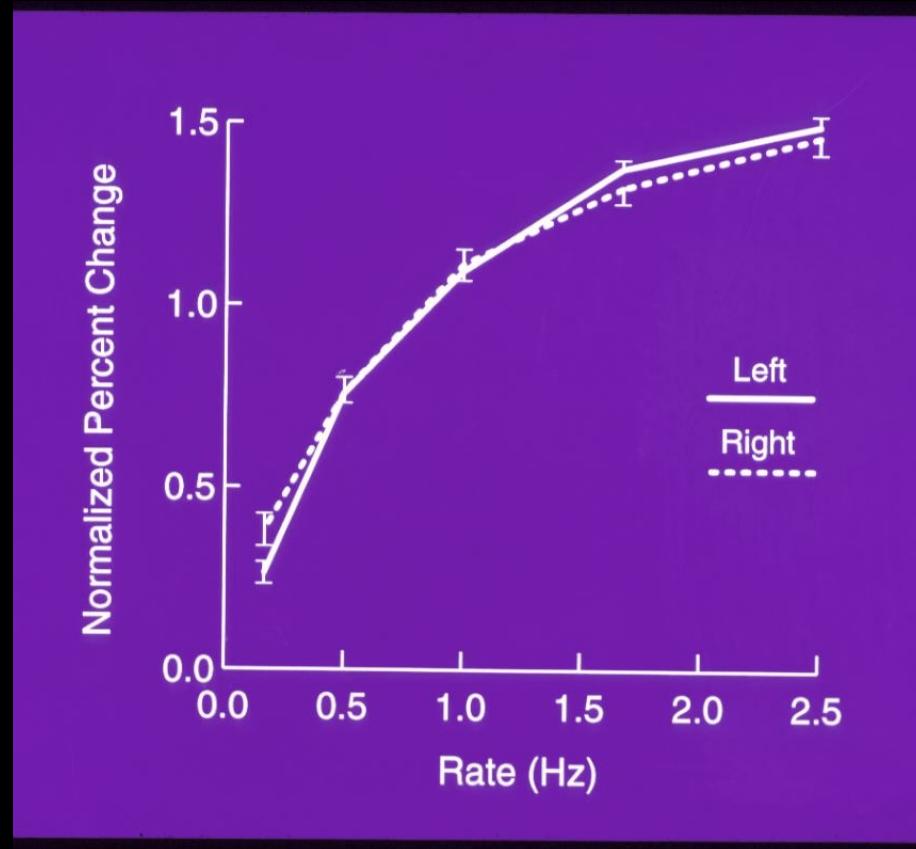
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# Motor Cortex



S. M. Rao et al, (1996) “Relationship between finger movement rate and functional magnetic resonance signal change in human primary motor cortex.” *J. Cereb. Blood Flow and Met.* 16, 1250-1254.

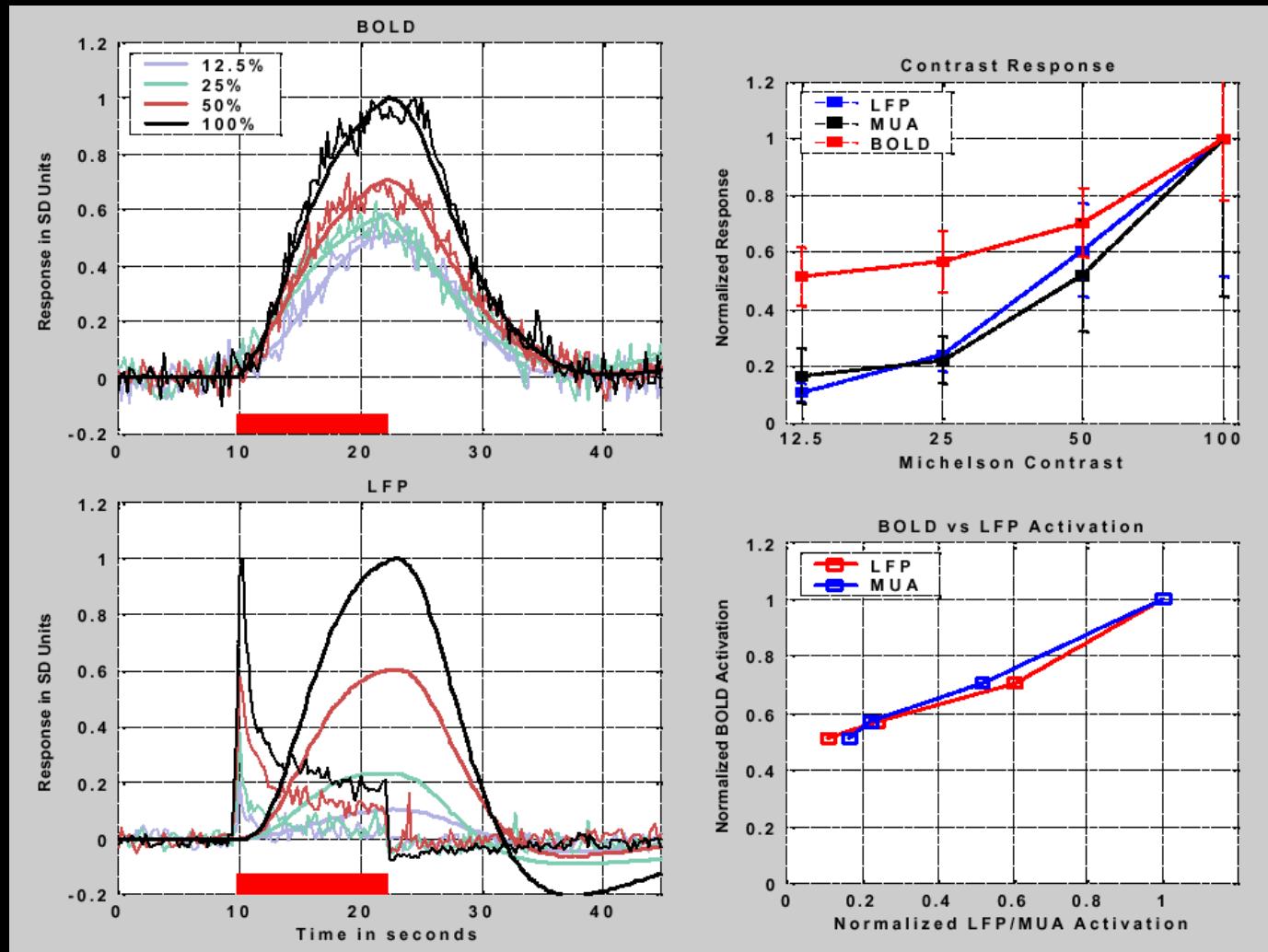
# Auditory Cortex



J. R. Binder, et al, (1994). “Effects of stimulus rate on signal response during functional magnetic resonance imaging of auditory cortex.” *Cogn. Brain Res.* 2, 31-38

# Relationship between neuronal activity and BOLD.

Magnitude

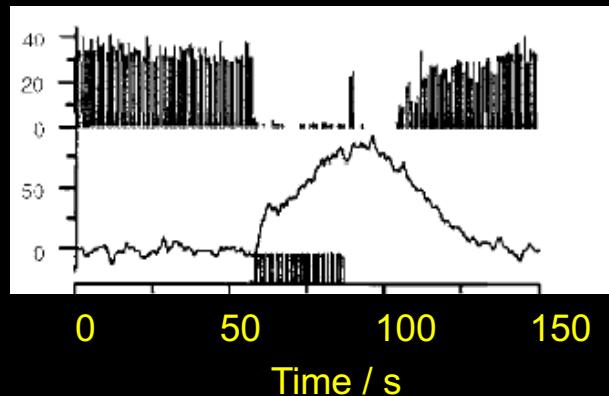


Logothetis et al. (2001) Nature, 412, 150-157

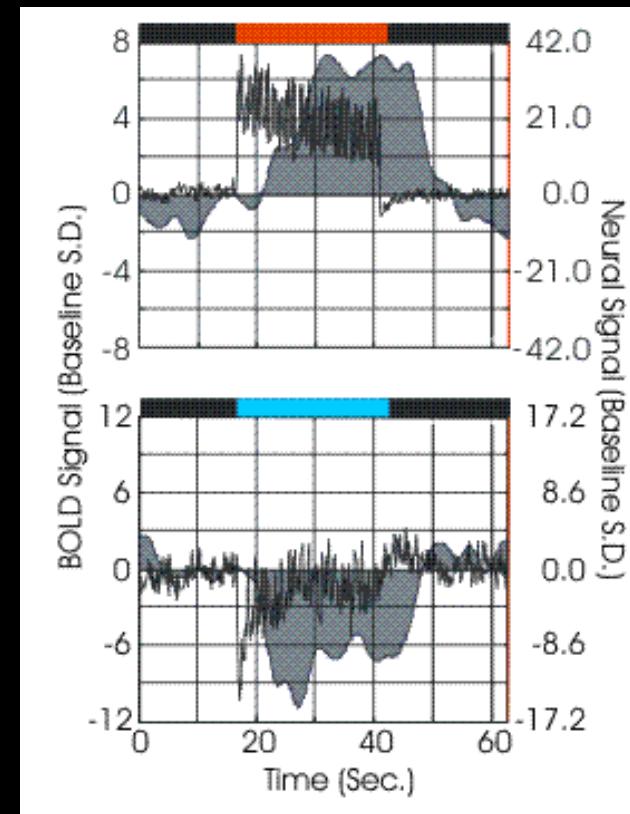
# Relationship between neuronal activity and BOLD.

Negative BOLD?

Inhibition



Mathiesen, et al (1998), J Physiol 512.2:555-566

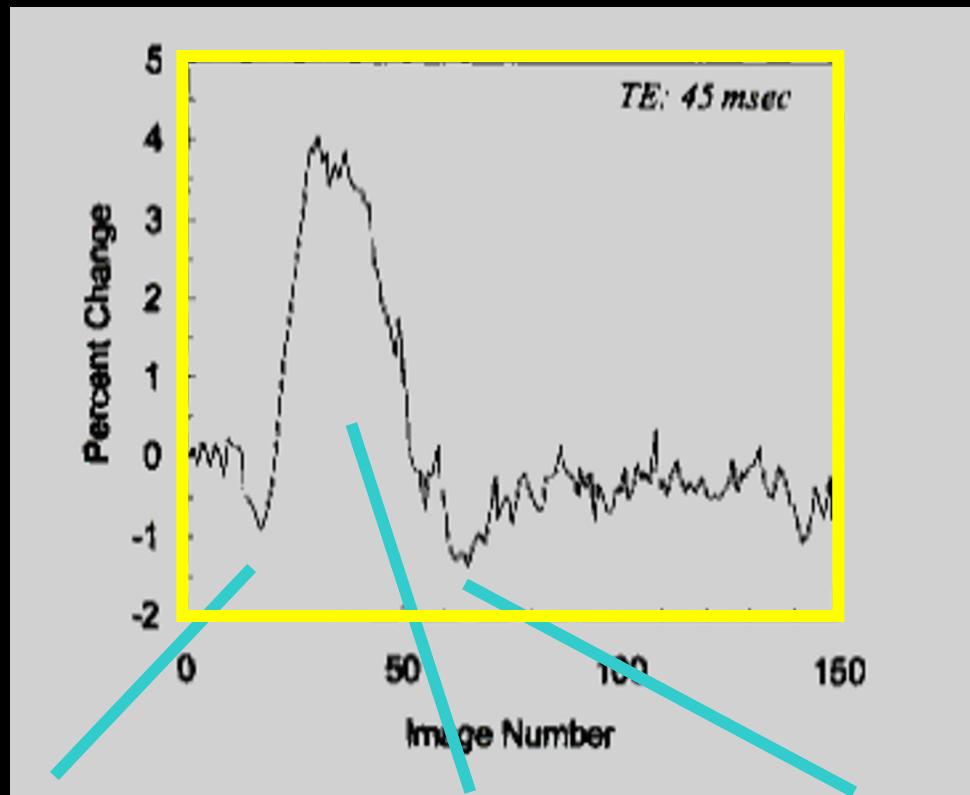


Schmuel et al. (2003) OHBM, 308

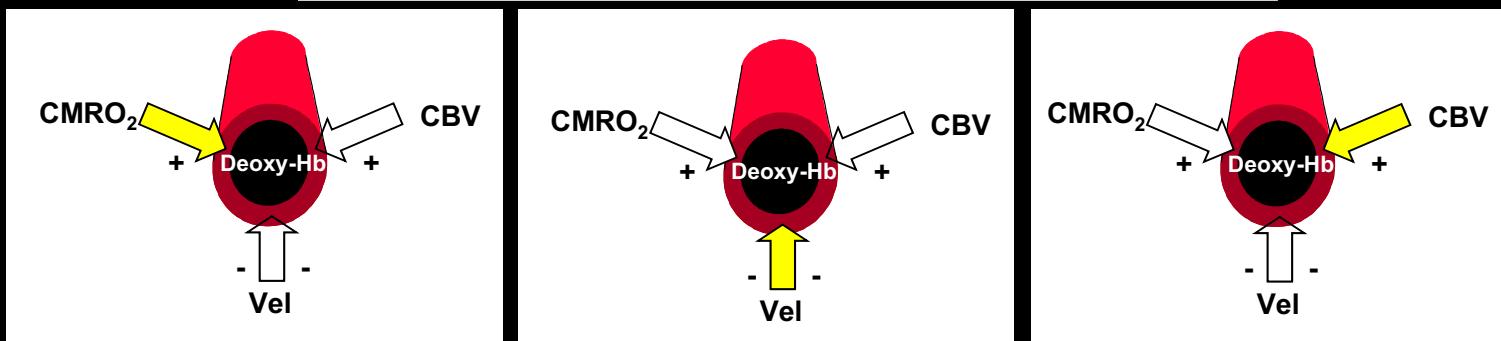
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# Sources of BOLD dynamic characteristics.

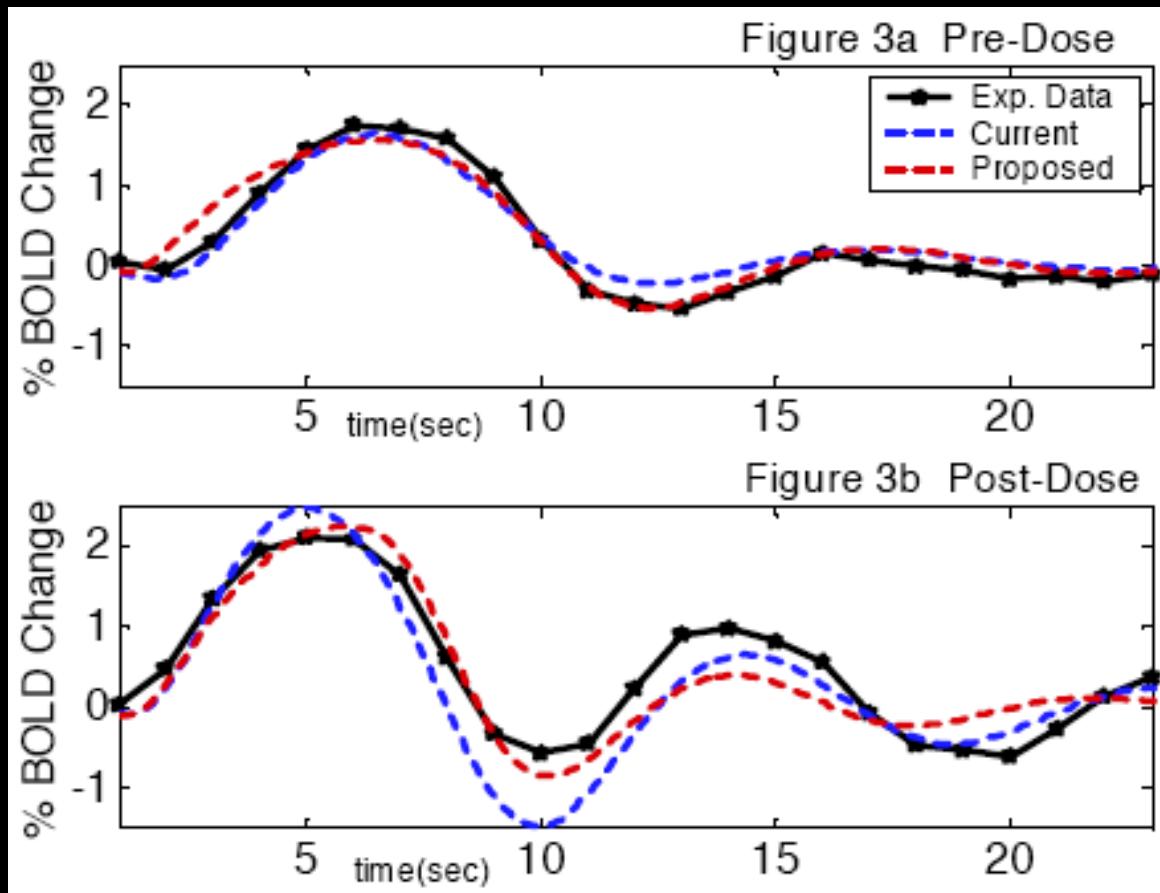


Yacoub E,  
Le TH,  
Ugurbil K,  
Hu X  
(1999)  
Magn Res  
Med  
41(3):436-41



# An example of dynamics modulation

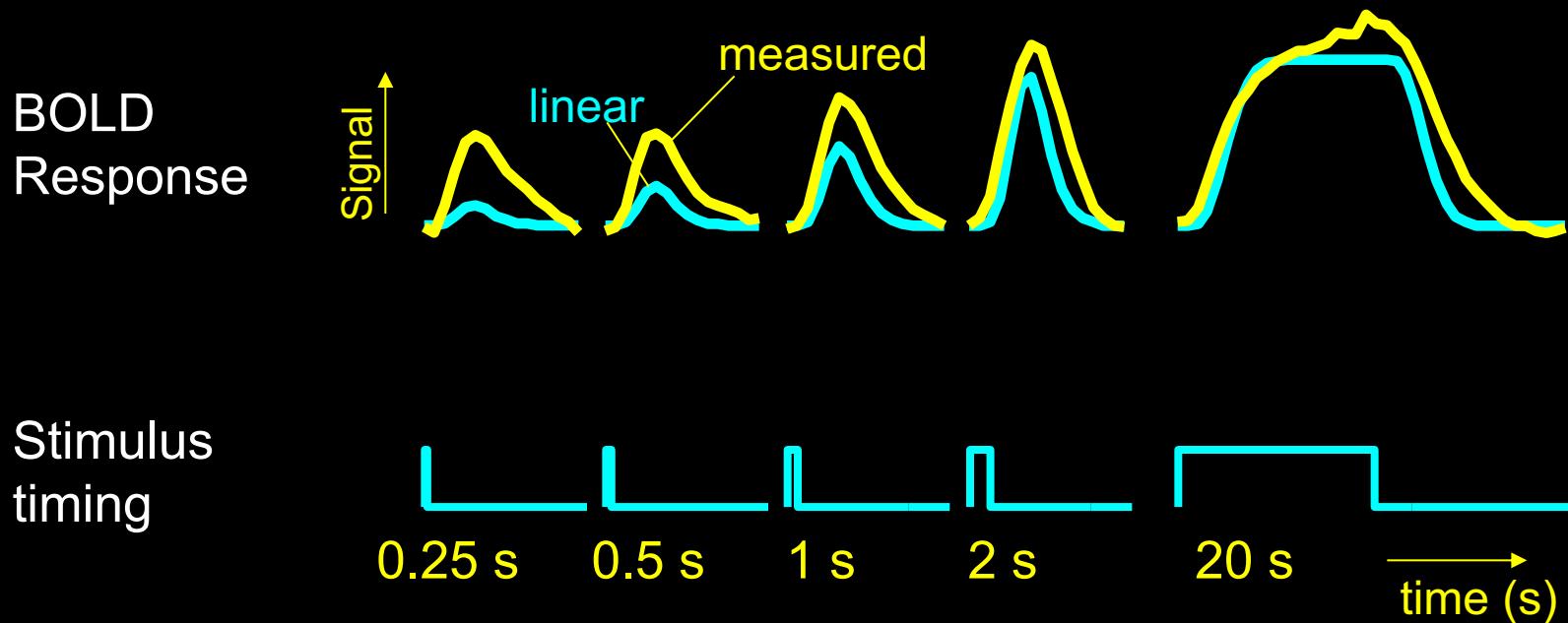
## Effects of Caffeine



Behzadi, et al (2004), ISMRM 279

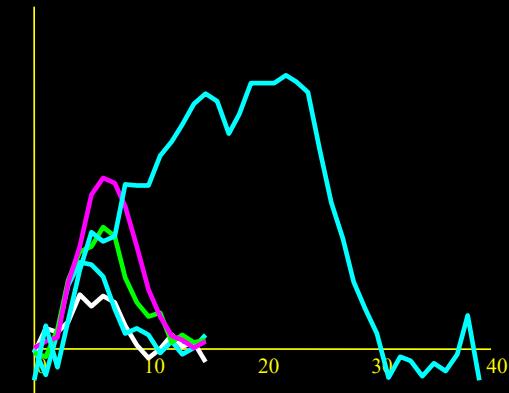
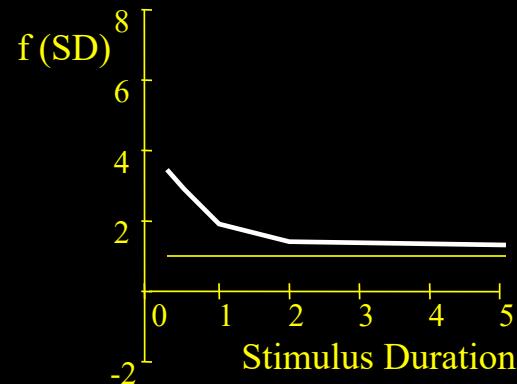
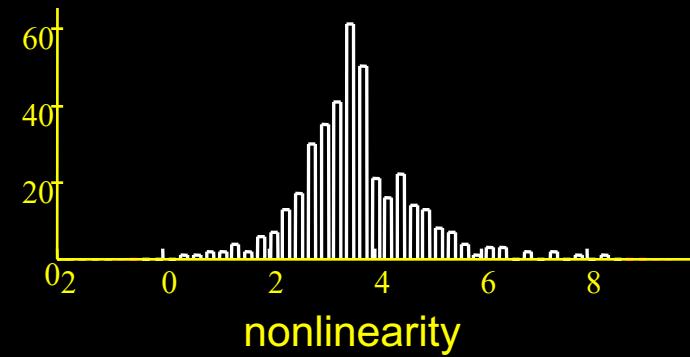
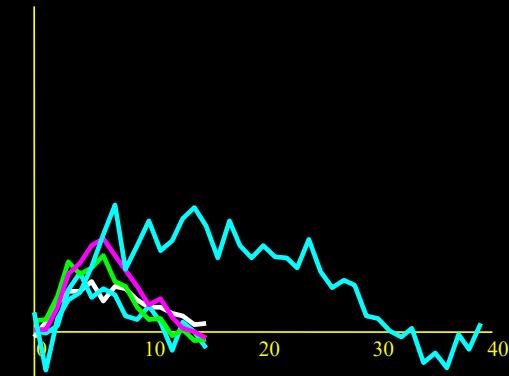
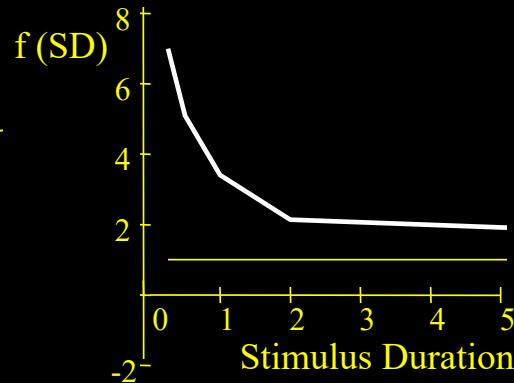
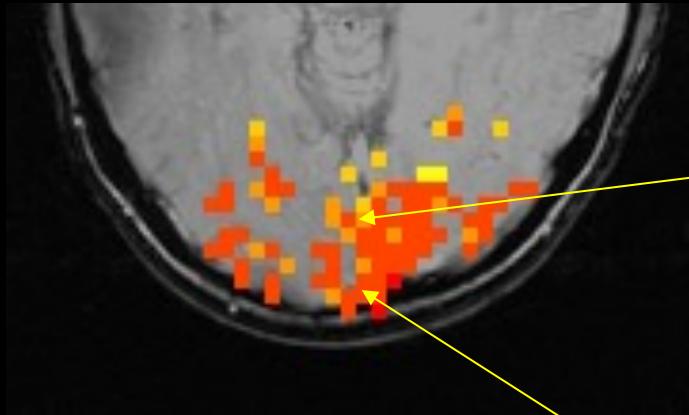
# Dynamic Nonlinearity Assessment

Different stimulus “ON” periods



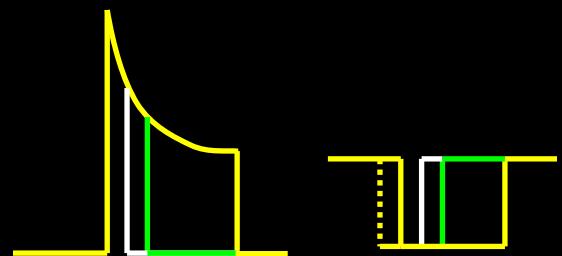
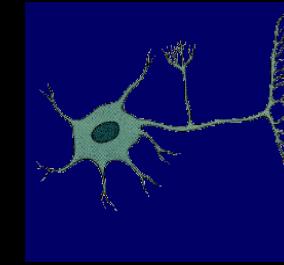
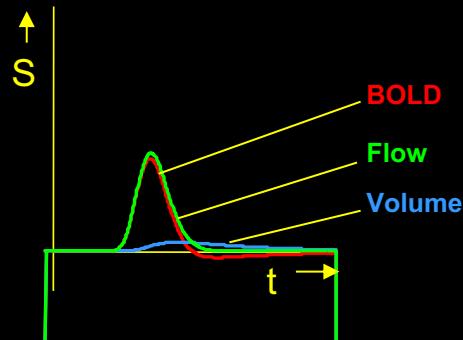
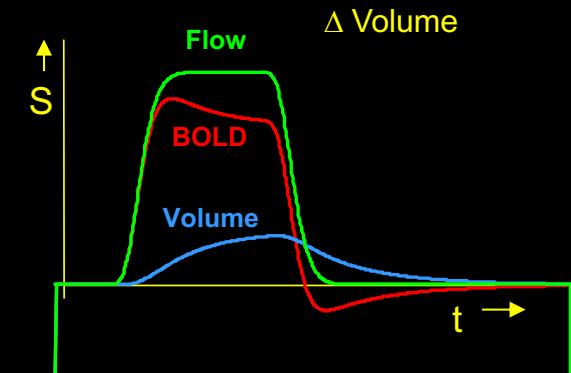
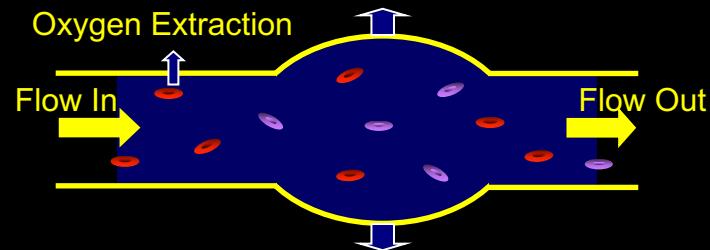
*Brief stimuli produce larger responses than expected*

# Spatial Heterogeneity of BOLD Nonlinearity



R. M. Birn, Z. Saad, P. A. Bandettini, (2001) “Spatial heterogeneity of the nonlinear dynamics in the fMRI BOLD response.” *NeuroImage*, 14: 817-826.

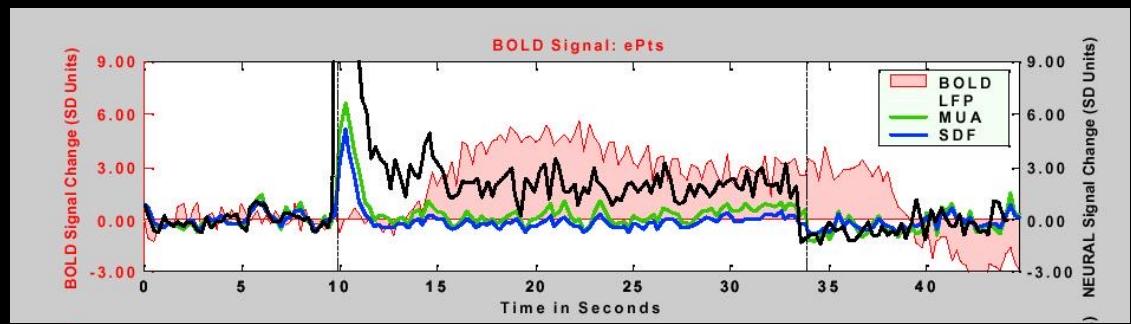
# Sources of this Nonlinearity



# BOLD Correlation with Neuronal Activity

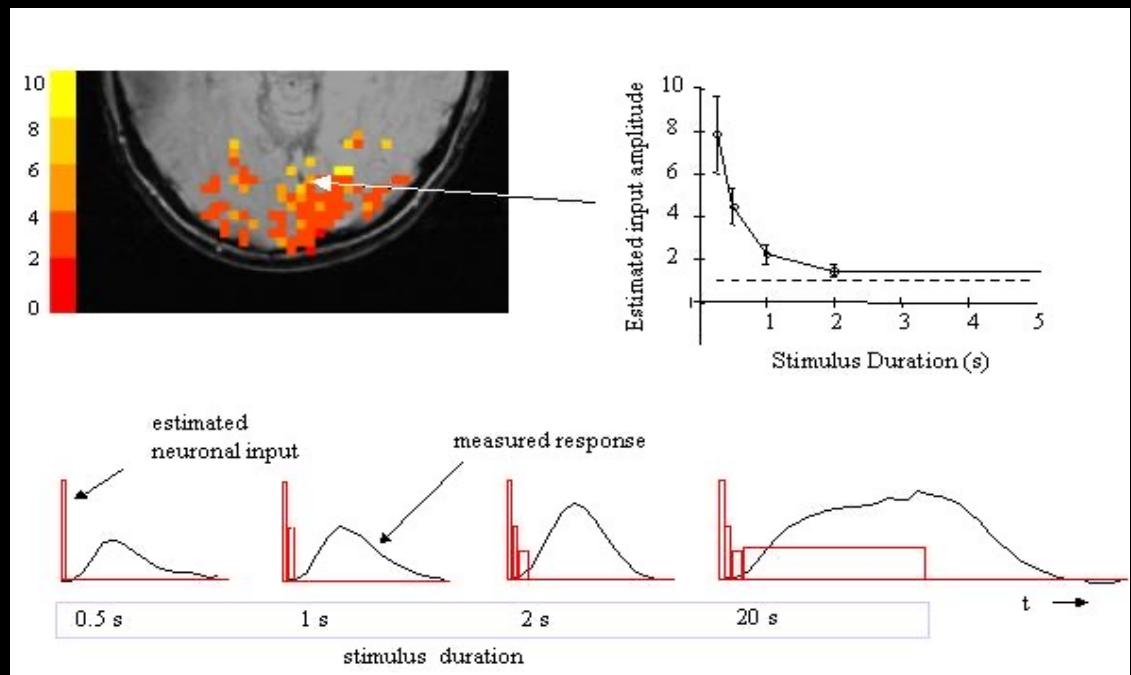
Logothetis et al. (2001)

“Neurophysiological investigation  
of the basis of the fMRI signal”  
Nature, 412, 150-157.



P. A. Bandettini and L. G.

Ungerleider, (2001) “From neuron  
to BOLD: new connections.”  
Nature Neuroscience, 4: 864-866.



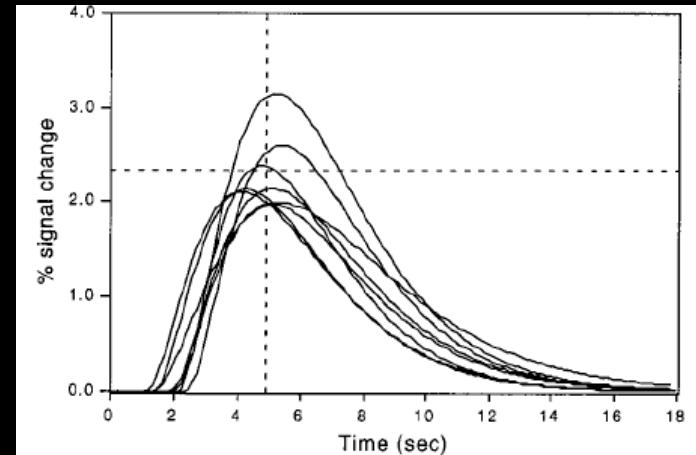
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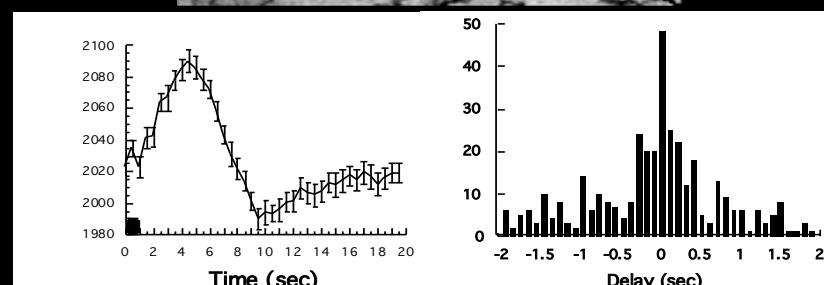
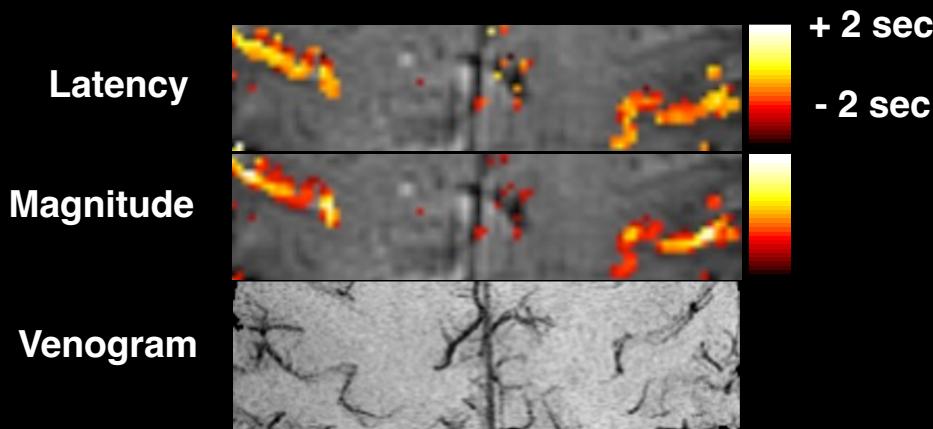
# Sources of spatial and temporal variability.

## Latency and Magnitude

From Subject to Voxel....



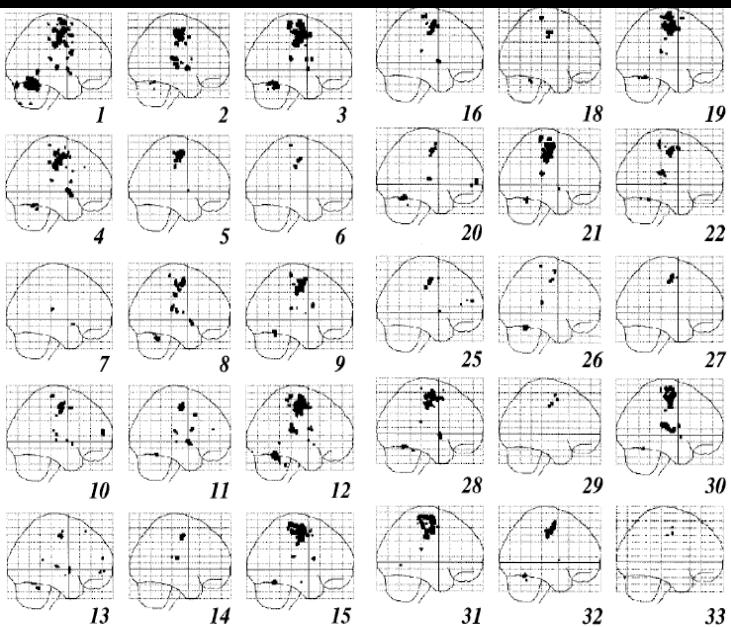
Miezin, et al (2000), NeuroImage 11, 735-759



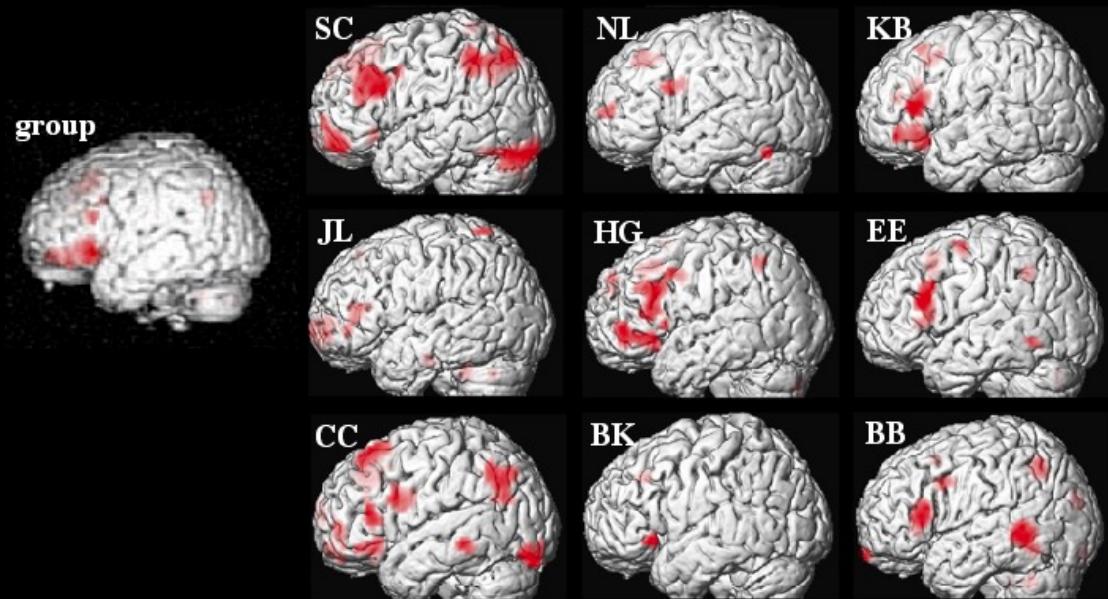
P. A. Bandettini, (1999) "Functional MRI" 205-220.

# Sources of spatial and temporal variability.

## Spatial Variation



McGonigle, et al (2000),  
NeuroImage 11, 708-734



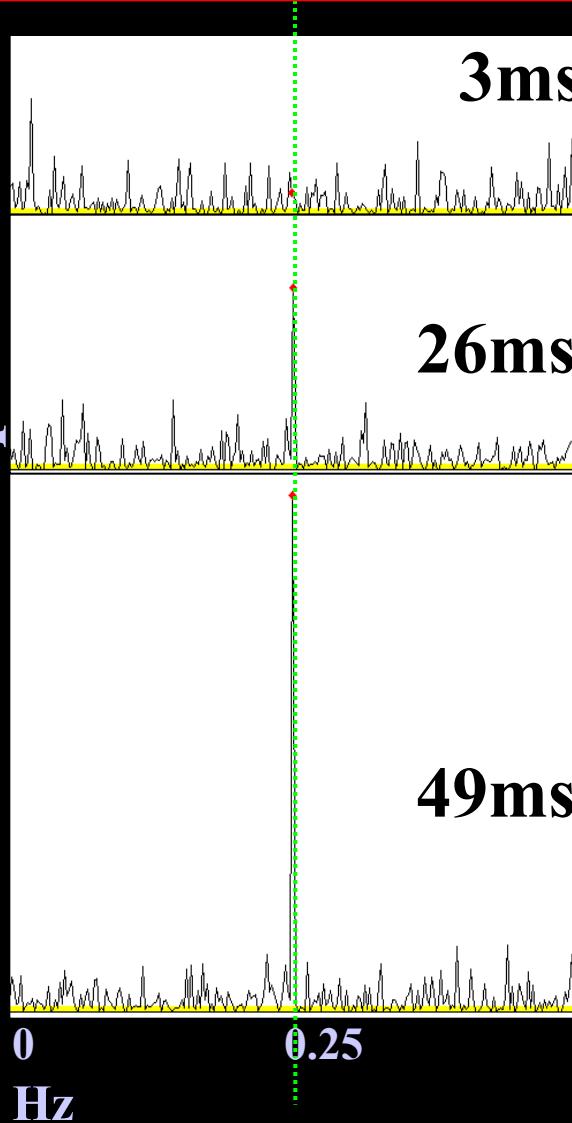
Courtesy, Mike Miler, UC Santa Barbara and  
Jack Van Horn, fMRI Data Center, Dartmouth

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# 0.25 Hz Breathing at 3T

Power Spectra



0.5

Hz

0.5

Hz

0.5

Hz

0.5

Hz

0.5

Hz

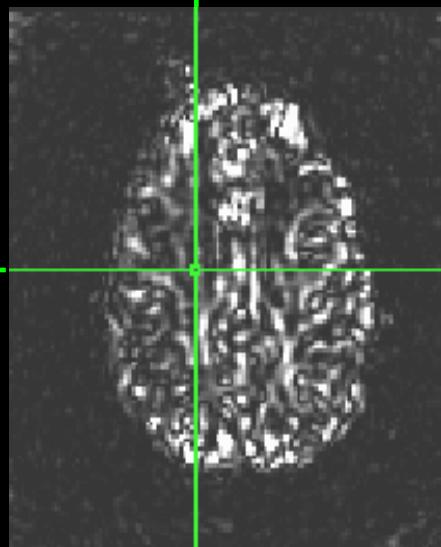
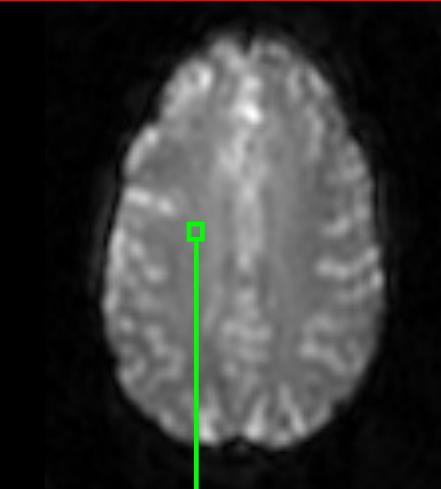


Image Respiratory map

# 0.68 Hz Cardiac rate at 3T

## Power Spectra

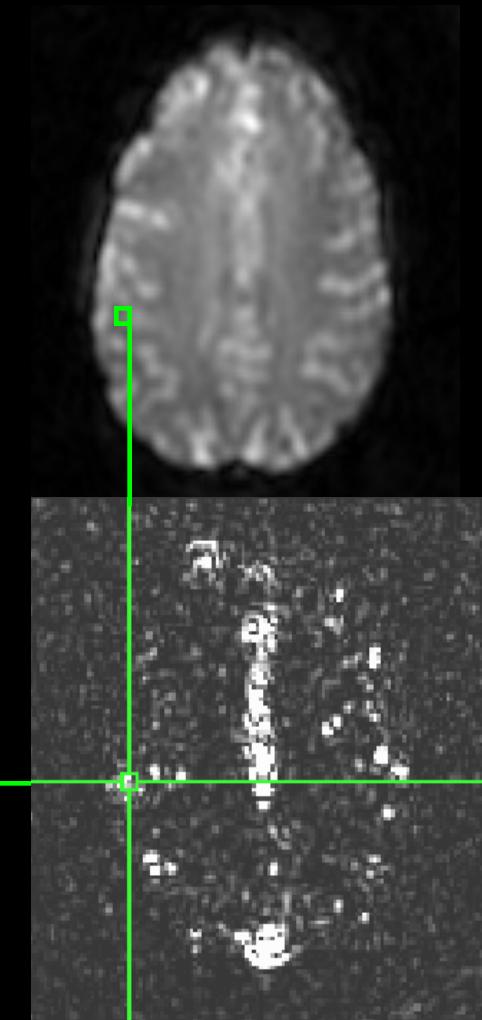
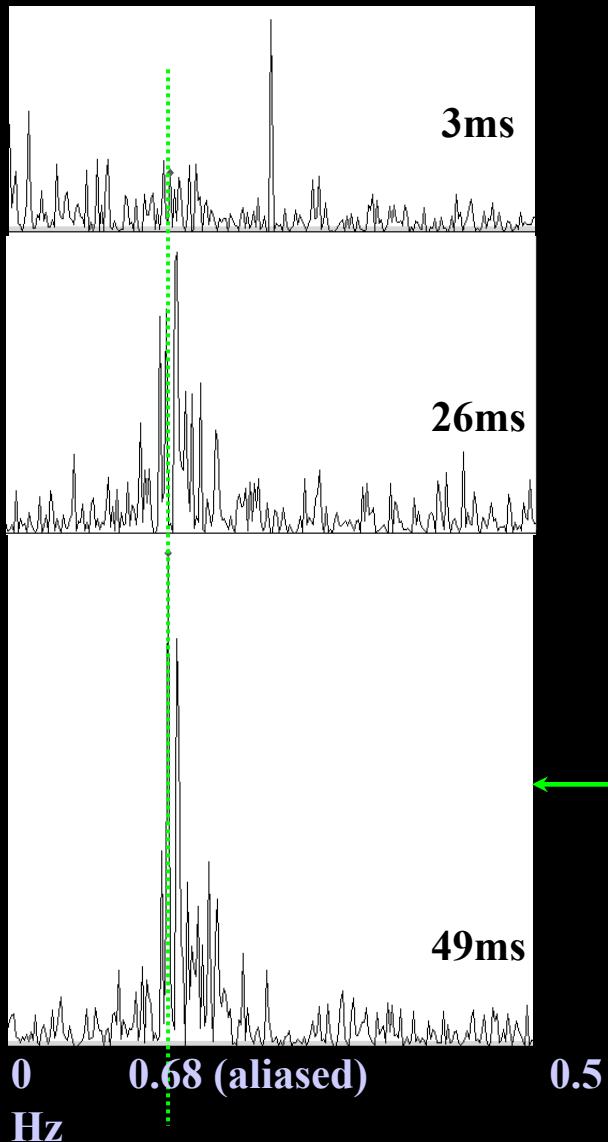
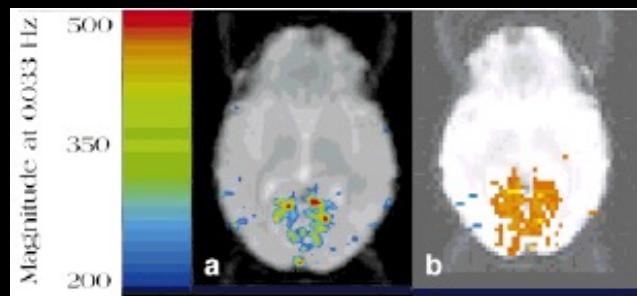
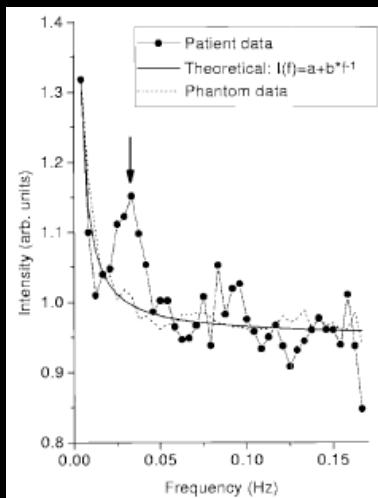


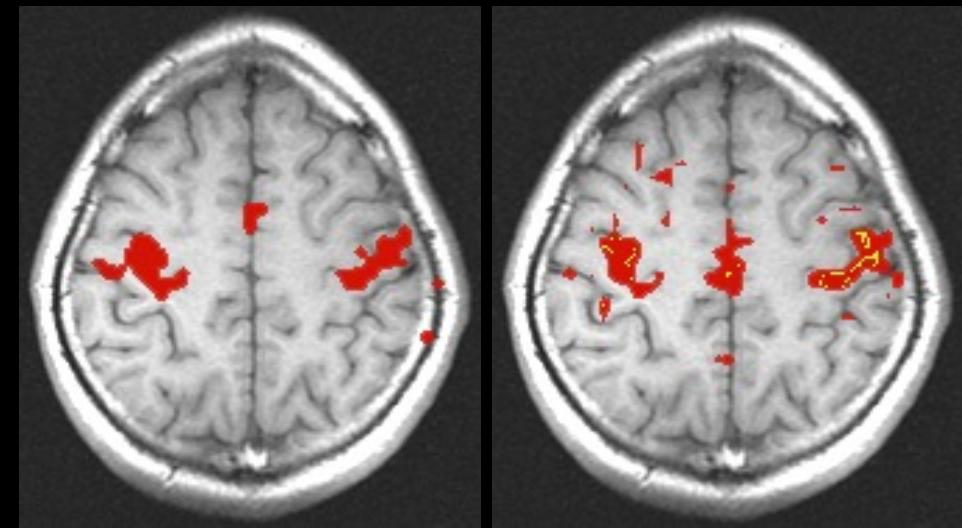
Image  
Cardiac map

# What's really in the noise?

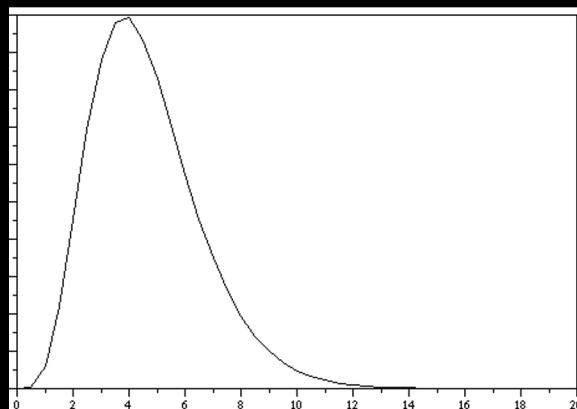
## Spontaneous Fluctuation Correlation



Kiviniemi, et al (2000), MRM 44, 373-378

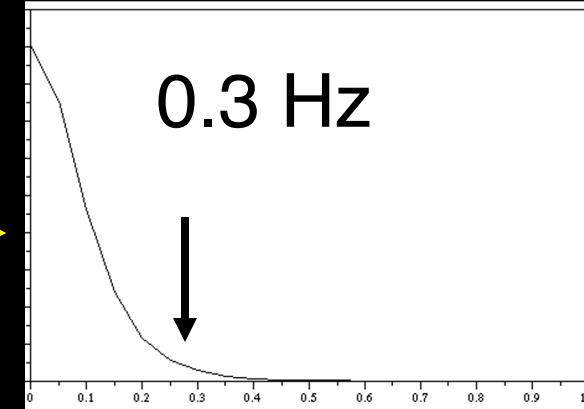


Biswal, et al (1995), MRM 34, 537-541



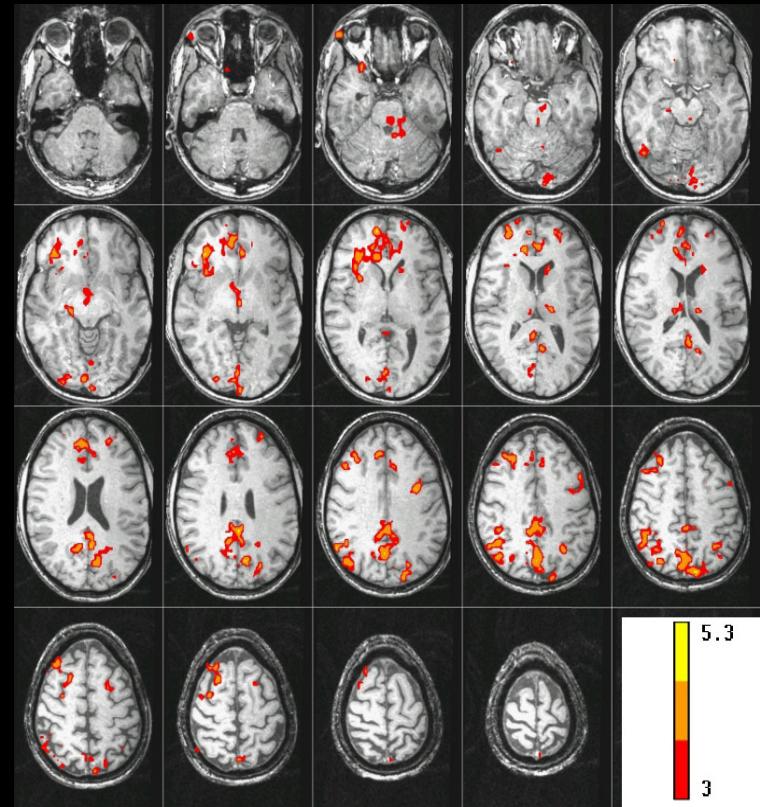
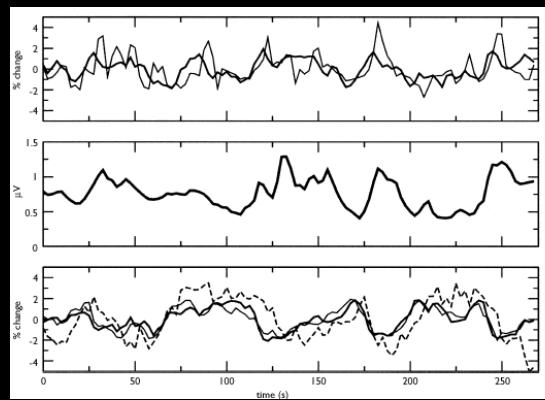
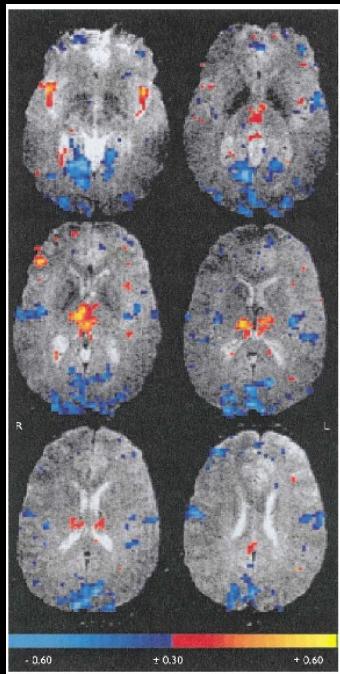
FFT  
↔

0.3 Hz



# What's really in the noise?

## Correlation with External Measures

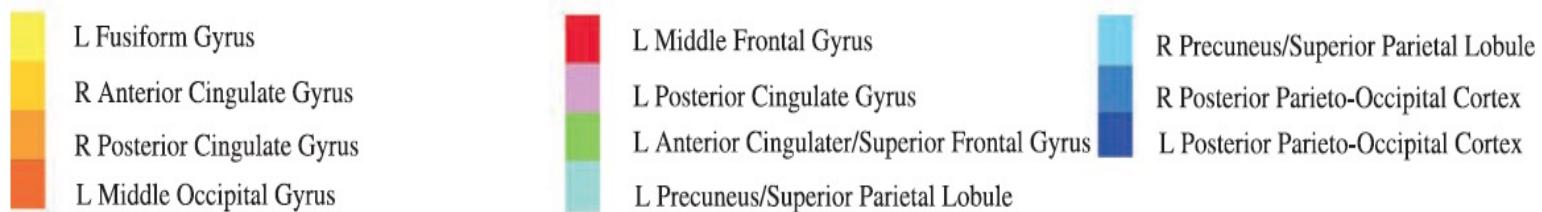
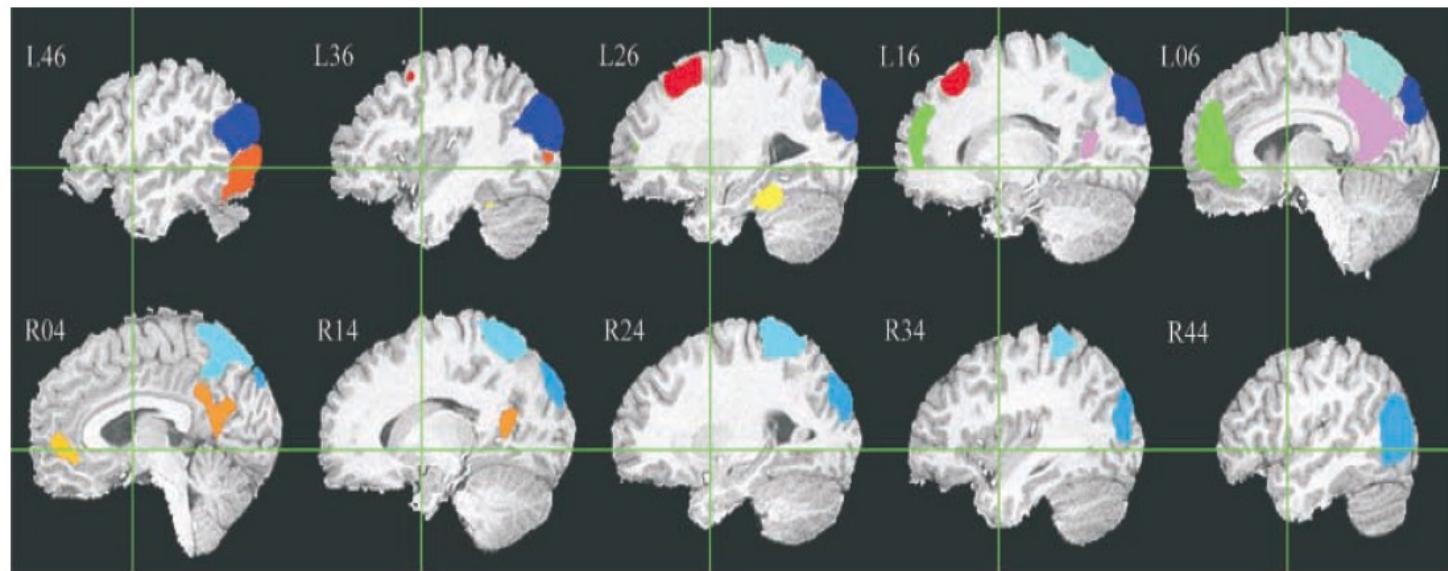


Goldman, et al (2002), Neuroreport

Patterson, et al (2002), NeuroImage 17, 1787-1806

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7. Ultimate temporal resolution?
8. Ultimate spatial resolution?
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10. Best processing and display methods?
11. Optimal field strength?



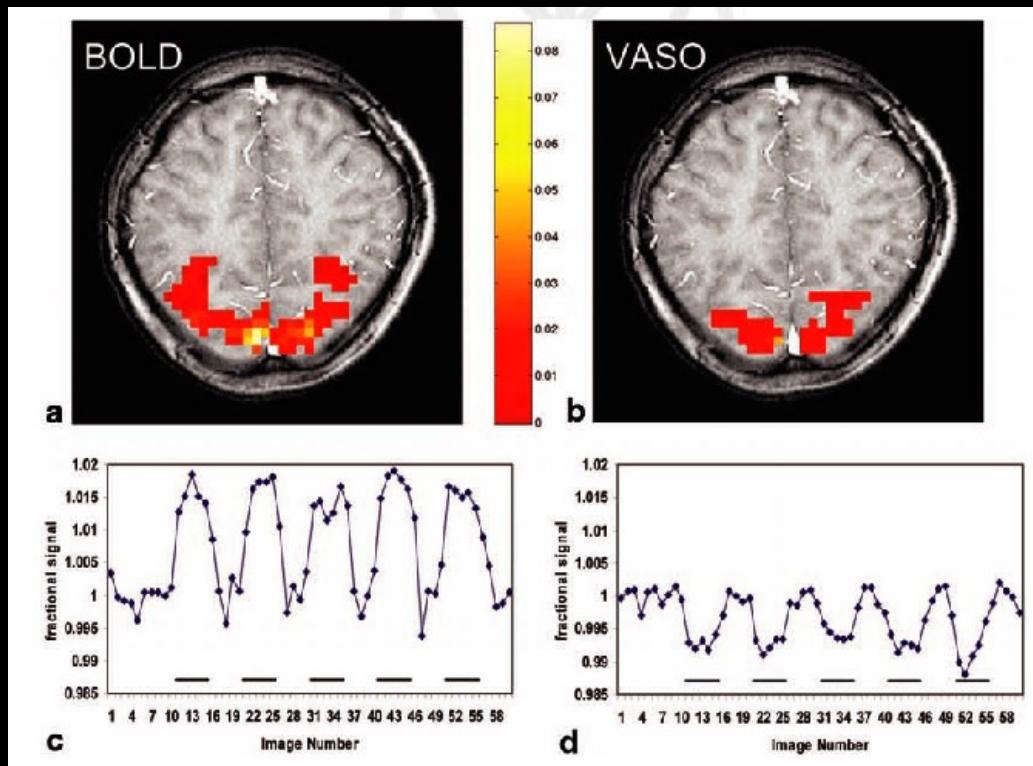
McKiernan, et al (2003), Journ. of Cog. Neurosci. 15 (3), 394-408

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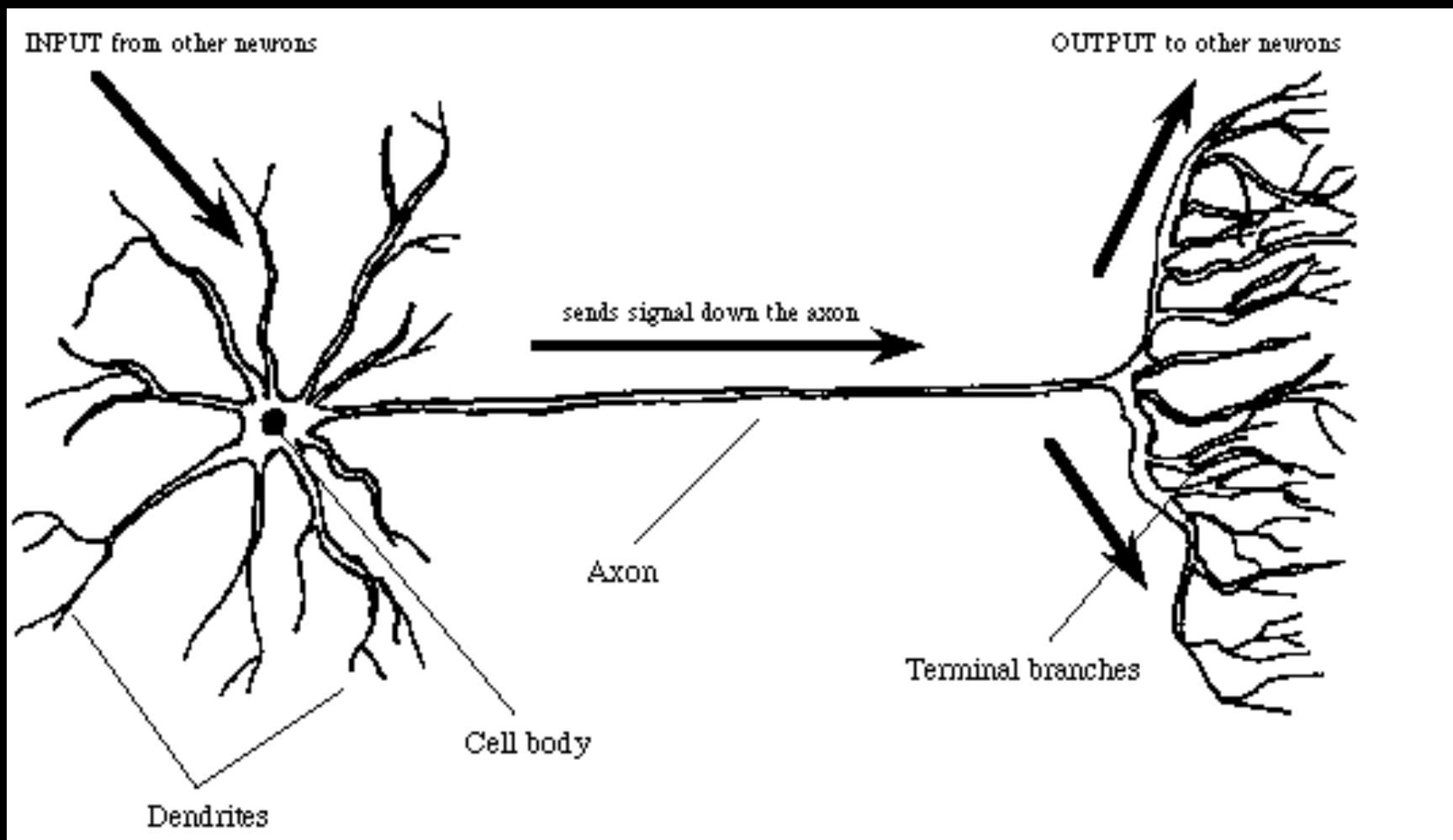
# Other sources of functional contrast?

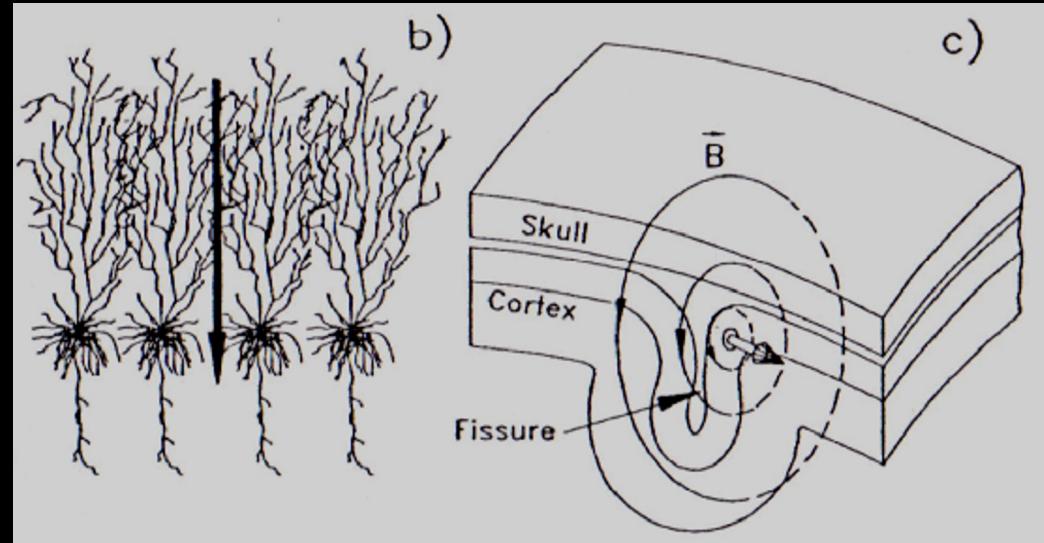
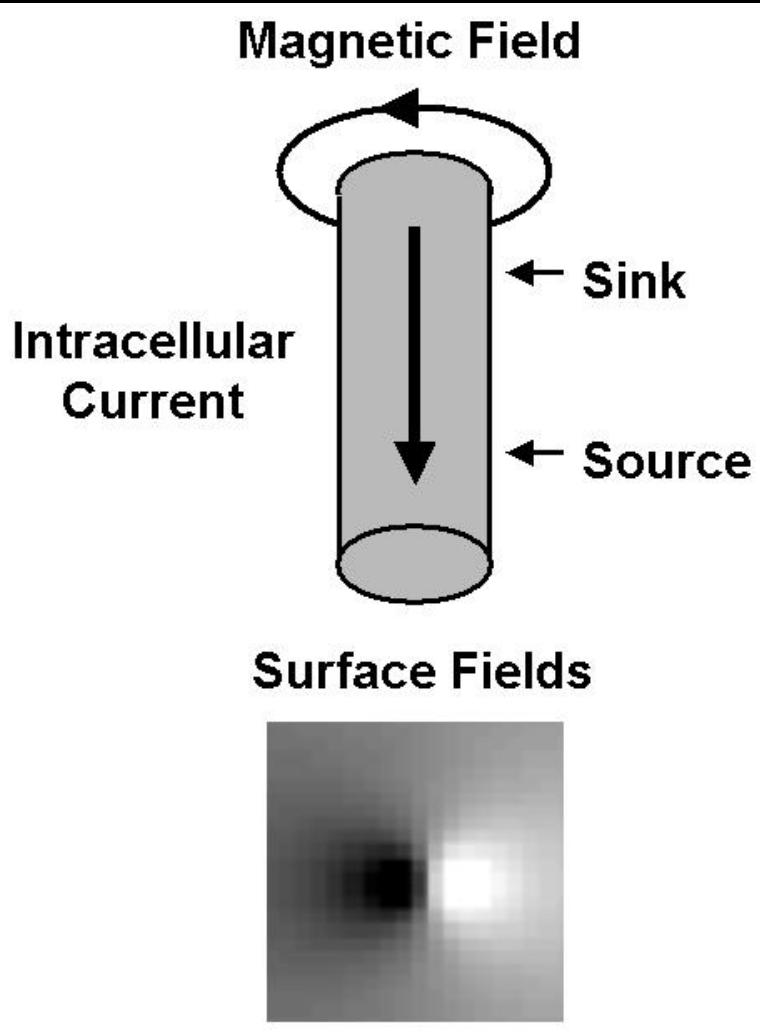
## Blood Volume



Lu, et al (2003) MRM 50 (2): 263-274

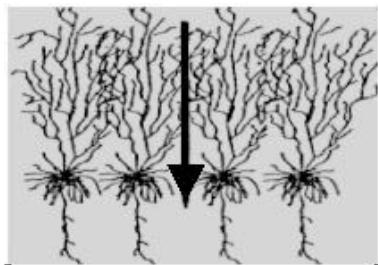
# Neuronal Current MRI?



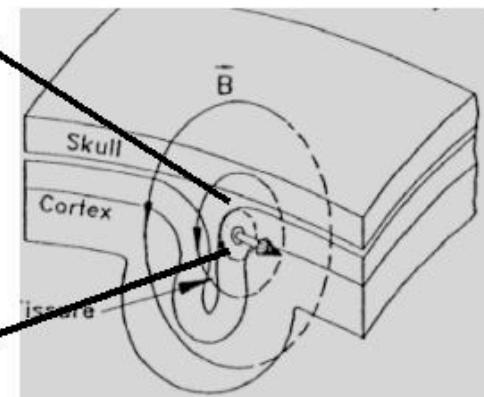
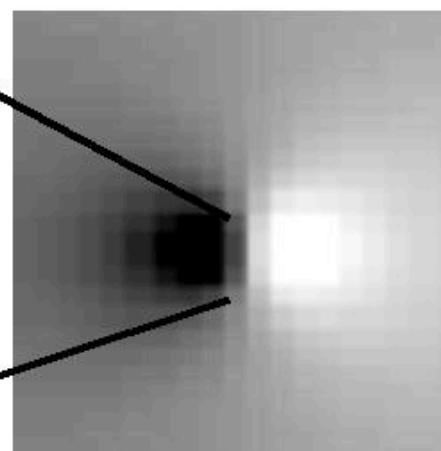
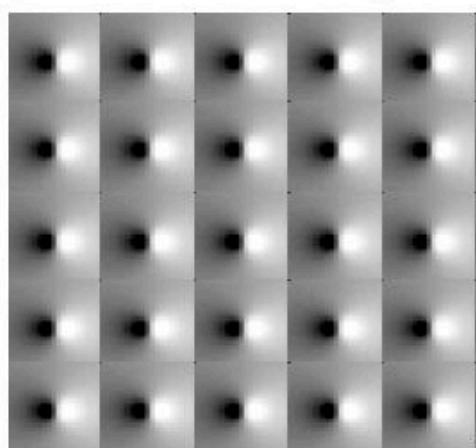


100 fT at on surface of skull

J.P. Wikswo Jr et al. *J Clin Neurophys*  
8(2): 170-188, 1991



## Surface Field Distribution Across Spatial Scales



# Magnetic field associated with single dendrite

**Single dendrite** having a diameter  $d$ , and length  $L$  behaves like a conductor with conductivity  $\sigma$ . Resistance is  $R=V/I$ , where  $R=4L/(\pi d^2 \sigma)$ . From Biot-Savart:



$$\mathbf{B} = \frac{\mu_0}{4\pi} \frac{Q}{r^2} = \frac{\mu_0}{16} \frac{d^2 \sigma V}{r^2}$$

by substituting  $d = 4\mu\text{m}$ ,  $\sigma \approx 0.25 \Omega^{-1} \text{ m}^{-1}$ ,  $V = 10\text{mV}$  and  $r = 4\text{cm}$

(typical measurement distance when using MEG)

the resulting value measured at the surface of a skull is:

$$\mathbf{B} \approx 0.002 \text{ fT}$$

J. Bodurka, P. A. Bandettini. *Toward direct mapping of neuronal activity: MRI detection of ultra weak transient magnetic field changes*. Magn. Reson. Med. 47: 1052-1058, (2002).

# Magnetic field associated with bundle of dendrites

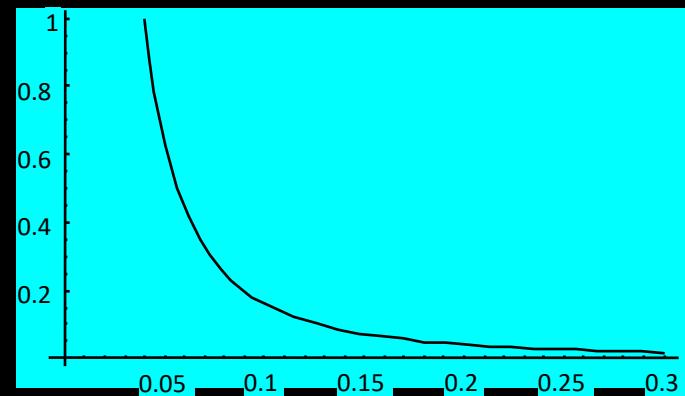
Because **B<sub>MEG</sub>=100fT** is measured by MEG on the scalp, at least 50,000 neurons ( $0.002\text{ fT} \times 50,000 = 100\text{ fT}$ ), must coherently act to generate such field. These bundles of neurons produce, within a typical voxel, 1 mm x 1 mm x 1 mm, a field of order:

$$B_{MRI} = B_{MEG} \left( \frac{r_{MEG}}{r_{MRI}} \right)^2 = B_{MEG} \left( \frac{4\text{ cm}}{0.1\text{ cm}} \right)^2 = 1600 B_{MEG}$$

$$\mathbf{B_{MRI} \approx 0.2 nT}$$

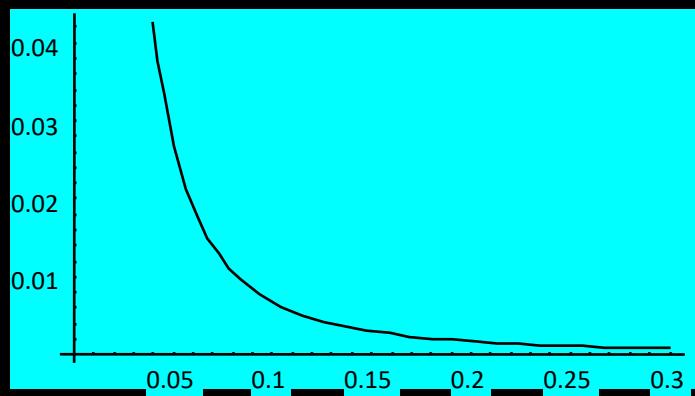
$$\Delta B = 100 \text{ fT} * (4 \text{ cm}/x)^2$$

$$\Delta B \text{ (nT)}$$



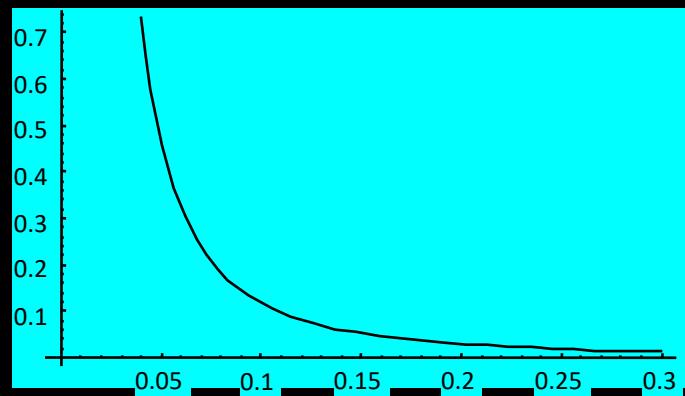
$$\Delta v = \gamma * \Delta B$$

$$\Delta v \text{ (Hz)}$$



$$\Delta\phi = \Delta v * TE * (\square\square\square/\pi)$$

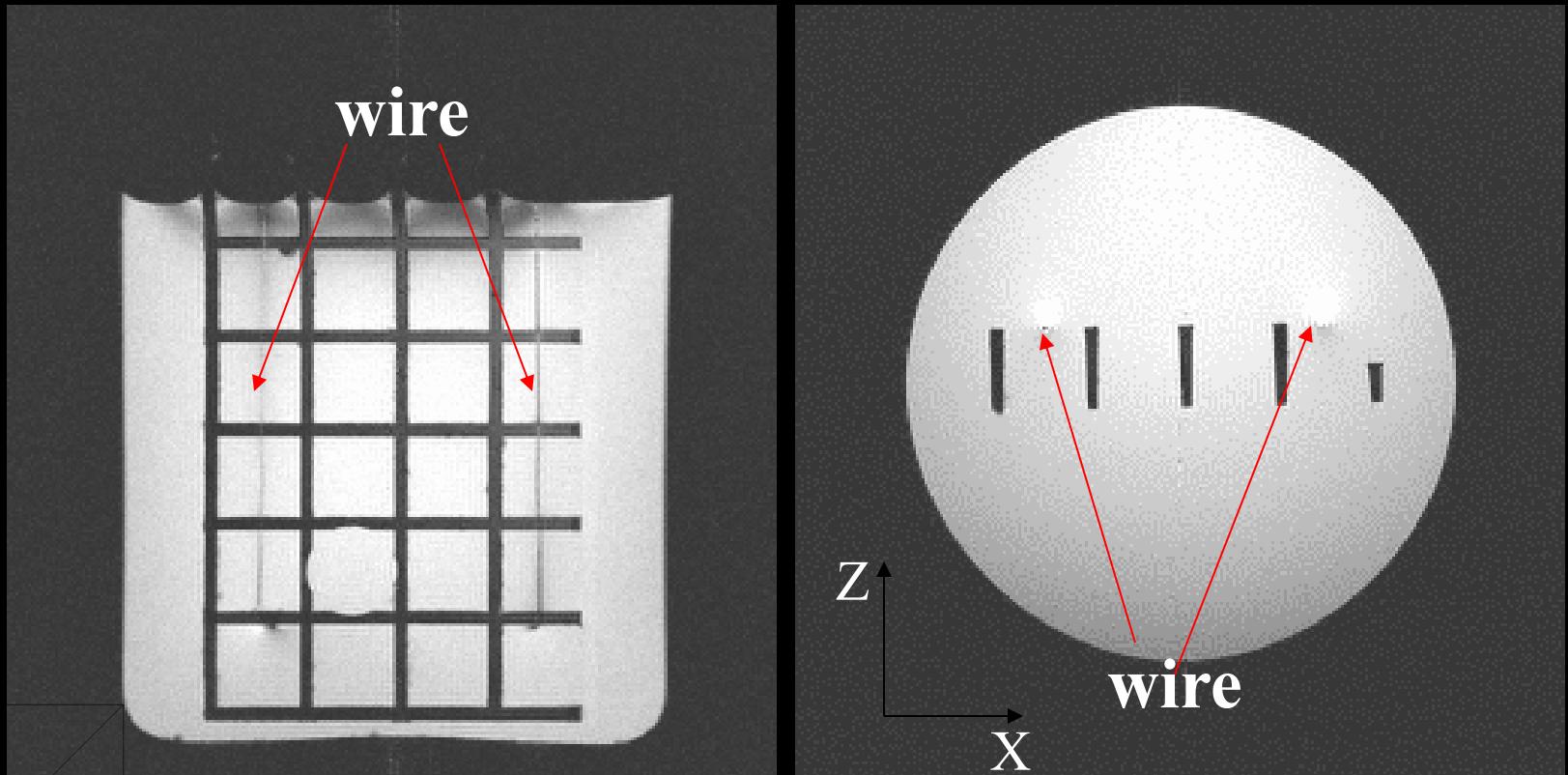
$$\Delta\phi \text{ (deg)}$$



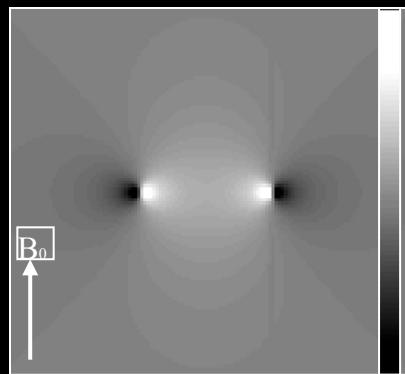
Distance from source (cm)

**Is 0.2 nT detectable?**

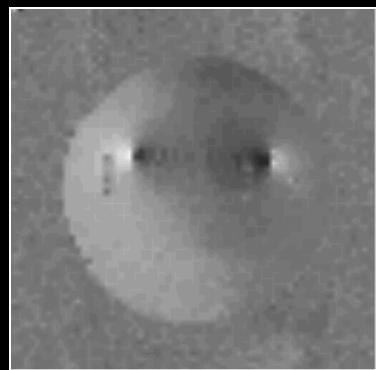
# Current Phantom Experiment



**calculated  $B_c \parallel B_0$**

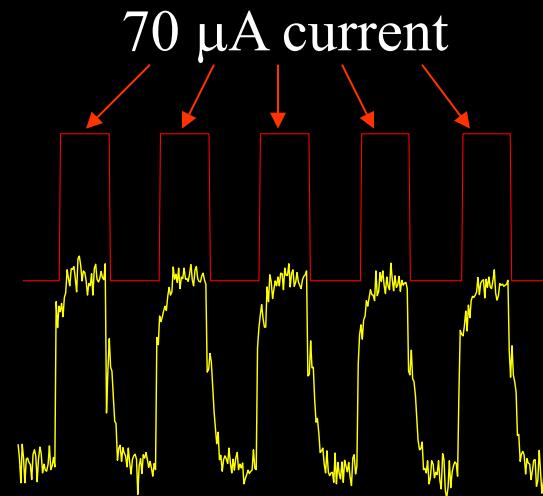


$$\Delta\phi \approx 20^\circ$$



**Correlation image**

## **Measurement**



**Single shot GE EPI**

J. Bodurka, P. A. Bandettini. Toward direct mapping of neuronal activity: MRI detection of ultra weak transient magnetic field changes, Magn. Reson. Med. 47: 1052-1058, (2002).

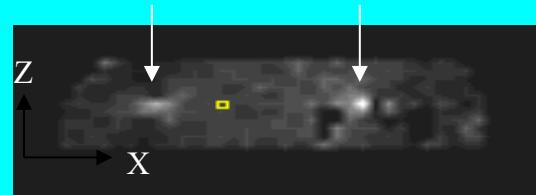
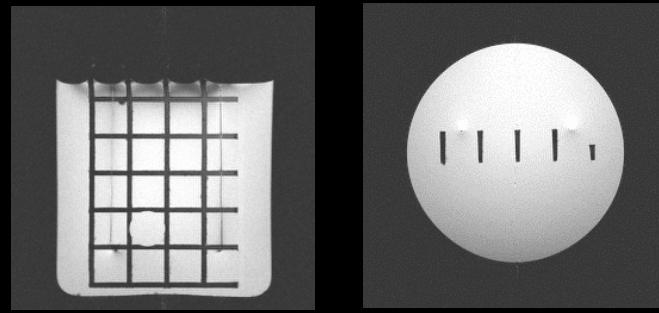
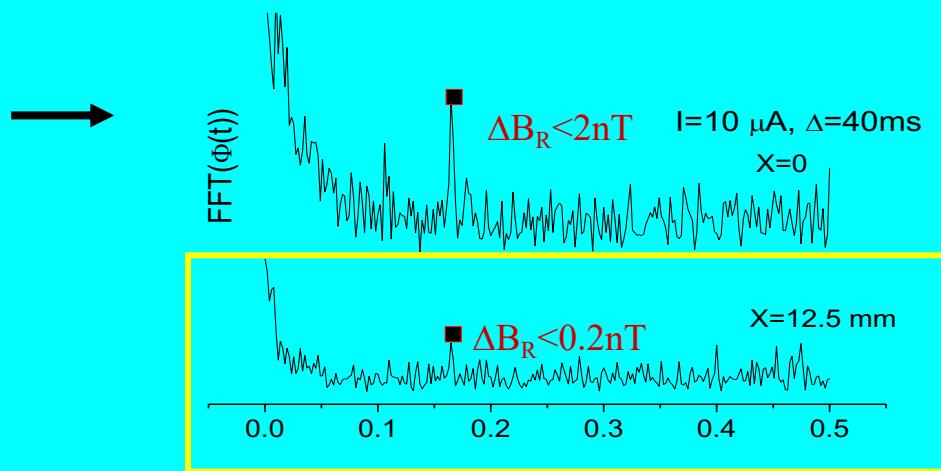


Figure 1

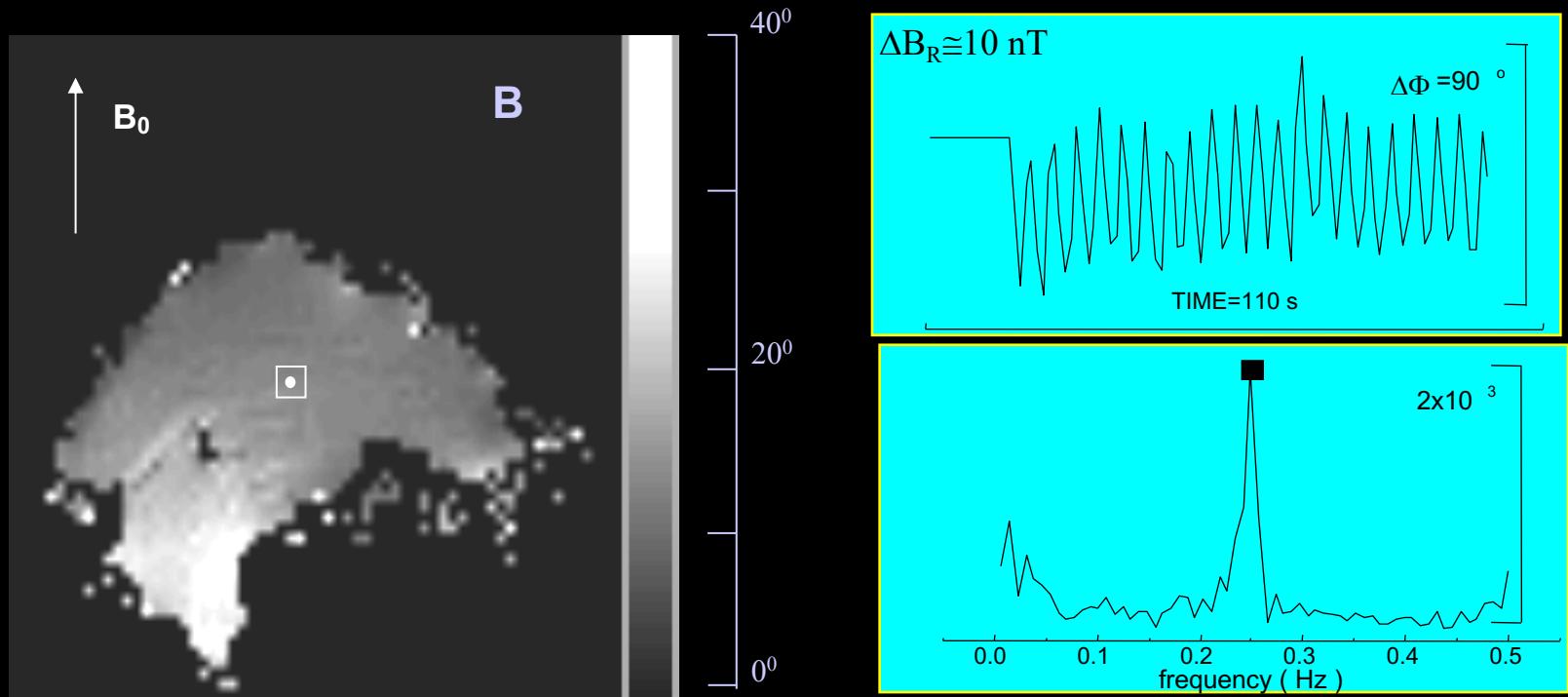


J. Bodurka, P. A. Bandettini. Toward direct mapping of neuronal activity: MRI detection of ultra weak transient magnetic field changes, Magn. Reson. Med. 47: 1052-1058, (2002).

# Main issues/obstacles:

- The effect is small
- Artifactual changes (respiration, cardiac) are order of mag larger
- The effect itself depends on geometry (phase/magnitude)
- The timing of the effect is variable
- BOLD still ubiquitous...

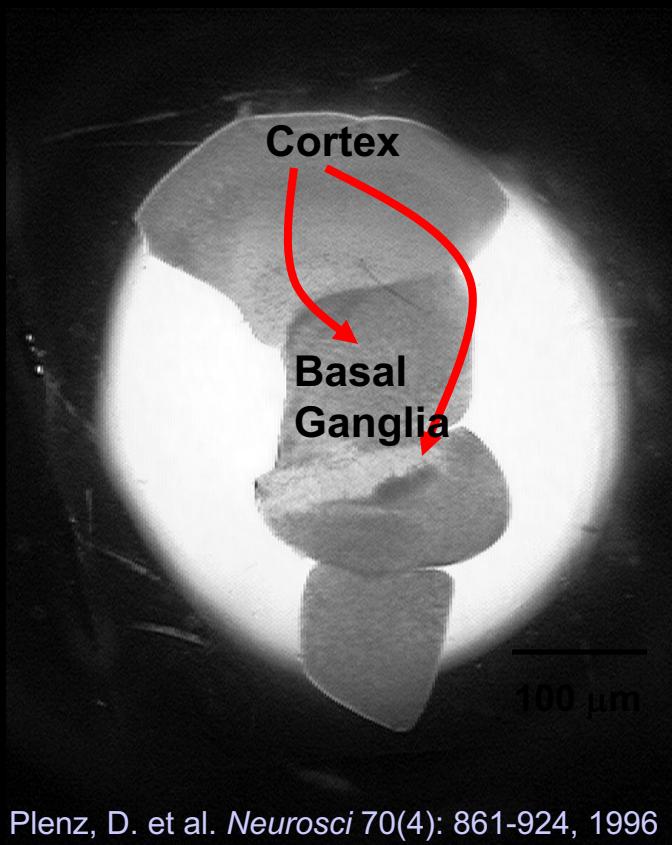
# Human Respiration



## in vitro model

---

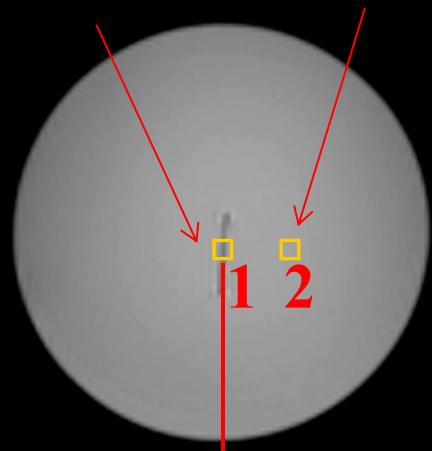
Organotypic (*no blood supply or hemoglobin traces*) sections of newborn-rat somato-sensory Cortex, or somato-sensory Cortex & Basal Ganglia



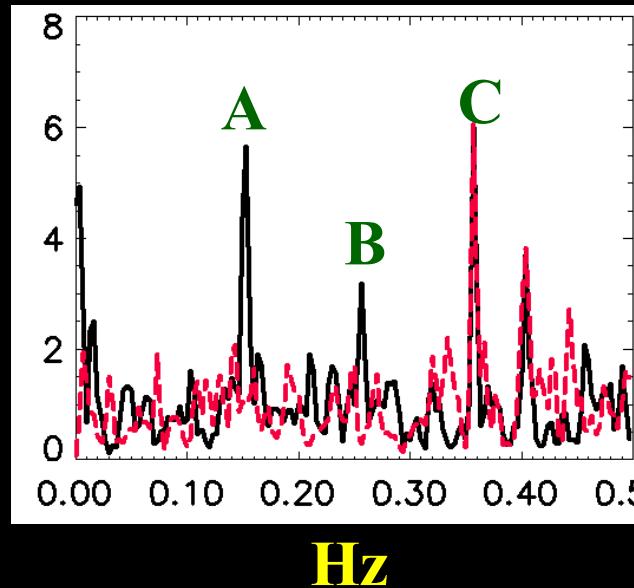
- Size: in-plane:~1-2mm<sup>2</sup>, thickness: 60-100μm
- Neuronal Population: 10,000-100,000
- Spontaneous synchronized activity < 2Hz
- Epileptiform activity
- Spontaneous beta freq. activity (20-30Hz)
- Network Activity Range: ~ 0.5-15μV

### 3 Tesla data

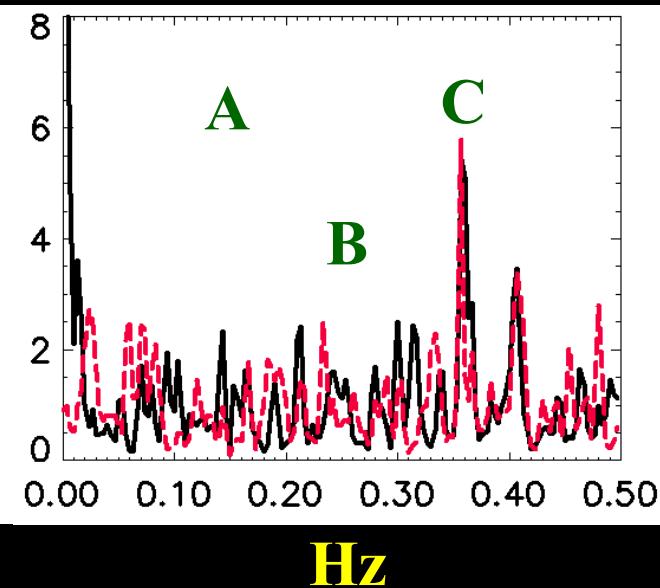
Culture      ACSF



*1: culture*



*2: ACSF*



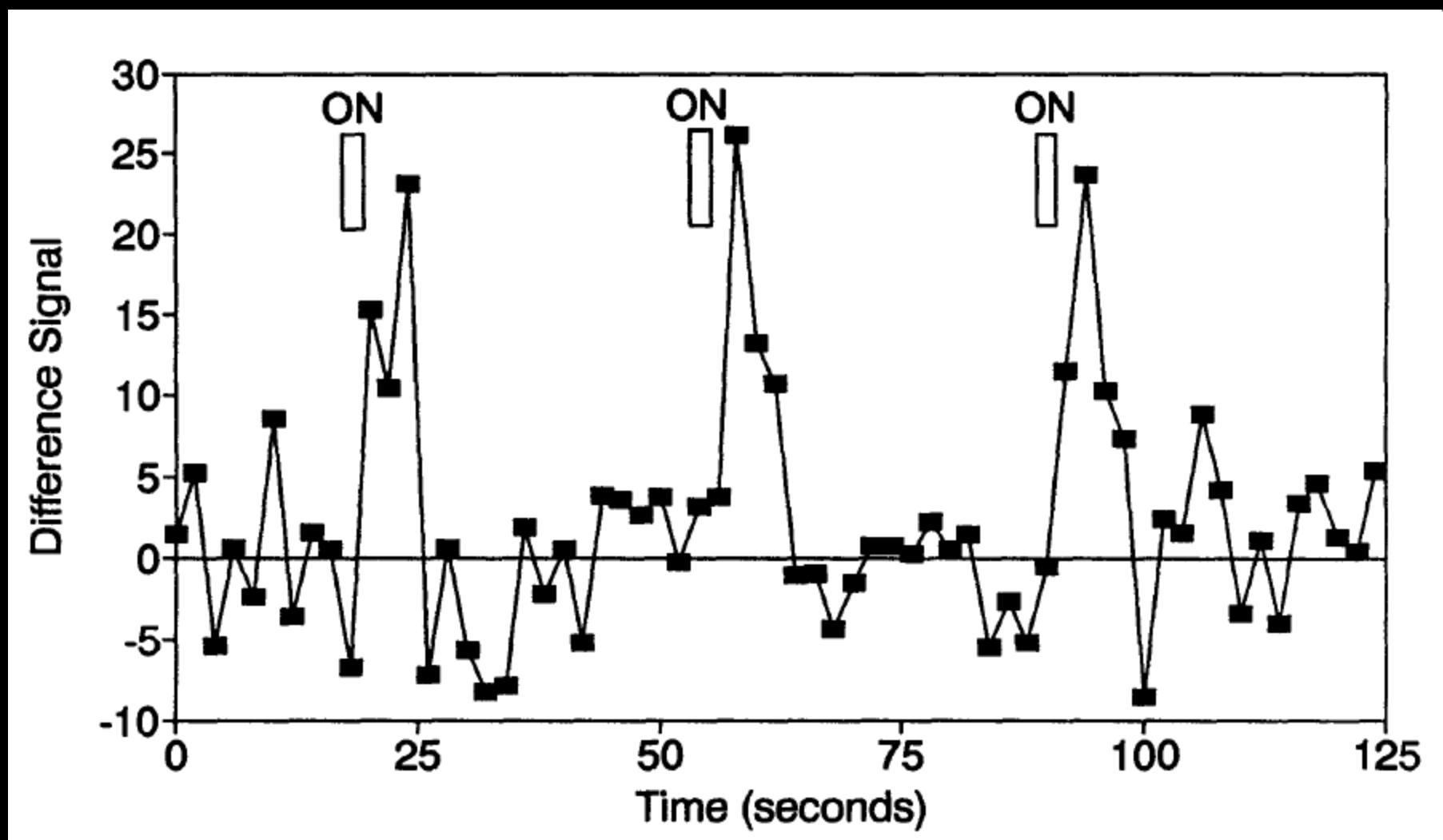
Active condition: black line  
Inactive condition: red line

A: 0.15 Hz activity, on/off frequency  
B: activity  
C: scanner noise (cooling-pump)

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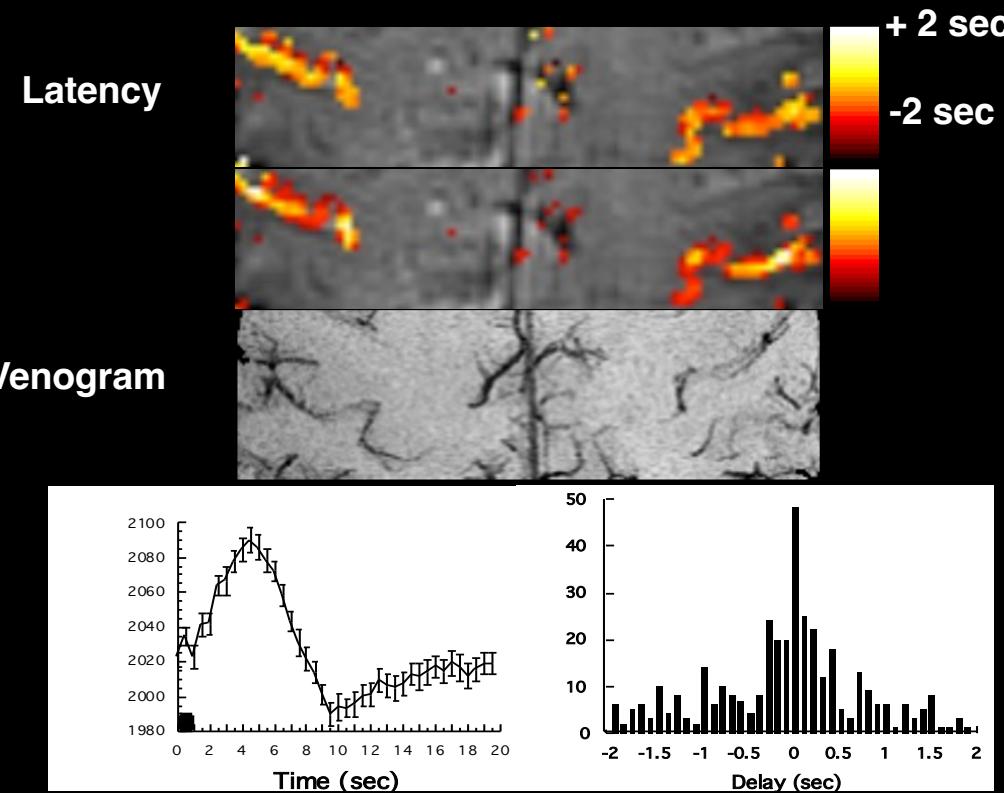
# First Event-related fMRI Results



Blamire, A. M., et al. (1992). "Dynamic mapping of the human visual cortex by high-speed magnetic resonance imaging." Proc. Natl. Acad. Sci. USA 89: 11069-11073.

# Ultimate temporal resolution?

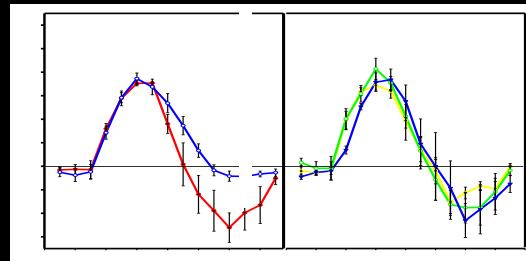
## Voxel-wise hemodynamic variation



P. A. Bandettini, (1999) "Functional MRI"  
205-220.

# Ultimate temporal resolution? Task Timing Modulation

**Word vs. Non-word**  
**0°, 60°, 120° Rotation**



Bellgowan, et al (2003), PNAS 100, 15820–15283

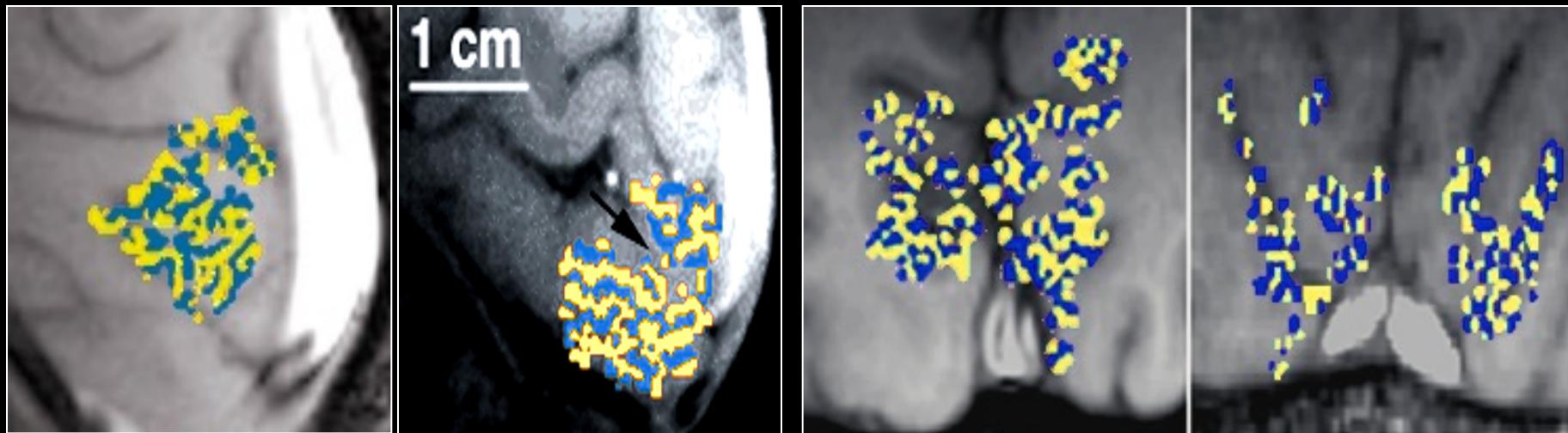
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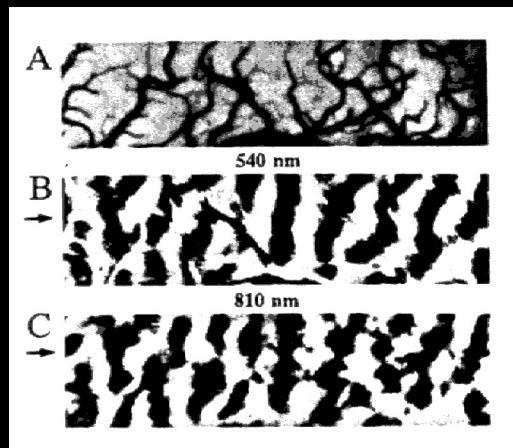
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# Ocular Dominance Column Mapping using fMRI



Menon, R. S., S. Ogawa, et al. (1997). "Ocular dominance in human V1 demonstrated by functional magnetic resonance imaging." *J Neurophysiol* 77(5): 2780-7.

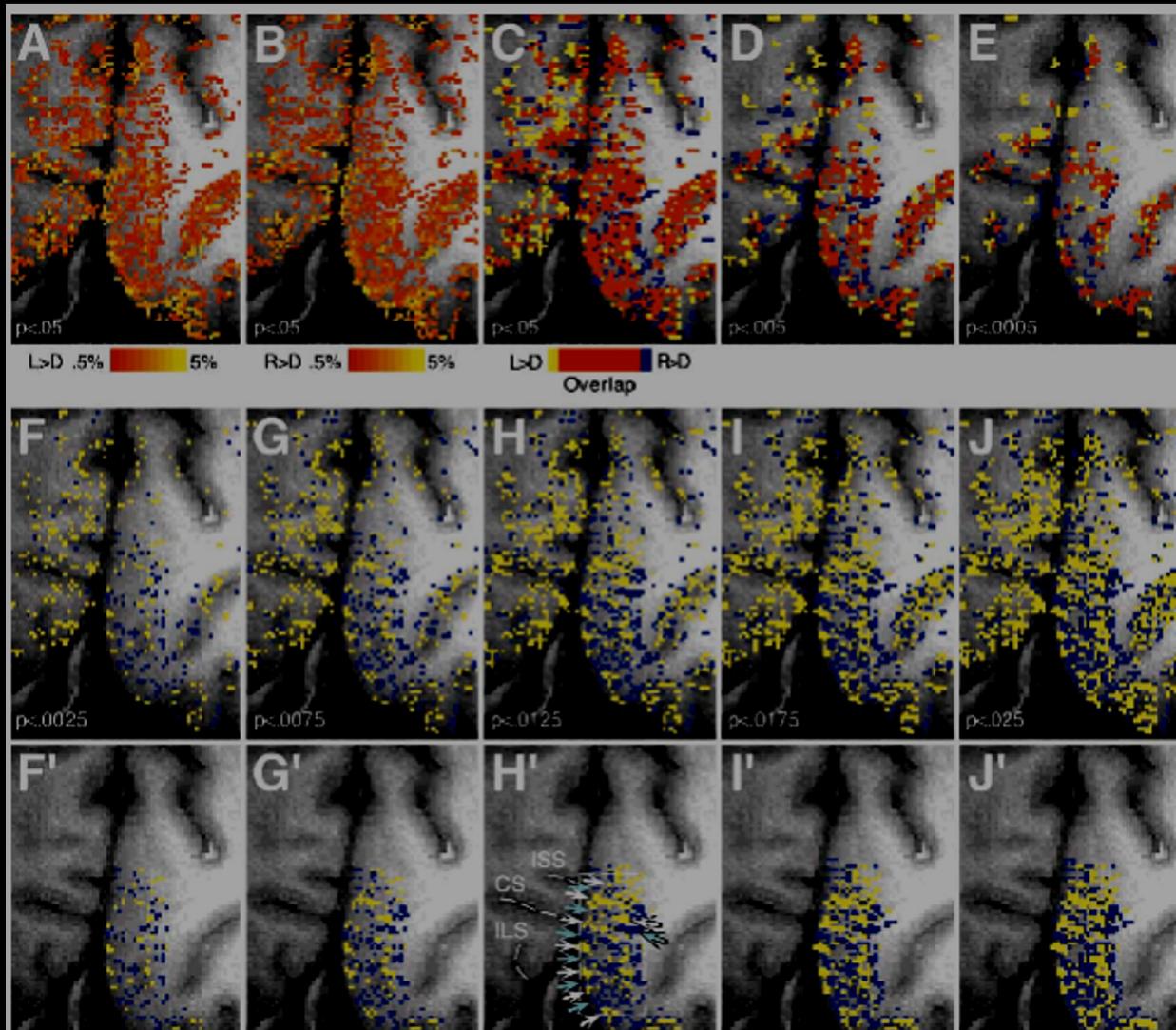


Optical Imaging

R. D. Frostig et. al, PNAS 87: 6082-6086, (1990).

# Human Ocular Dominance Columns as Revealed by High-Field Functional Magnetic Resonance Imaging

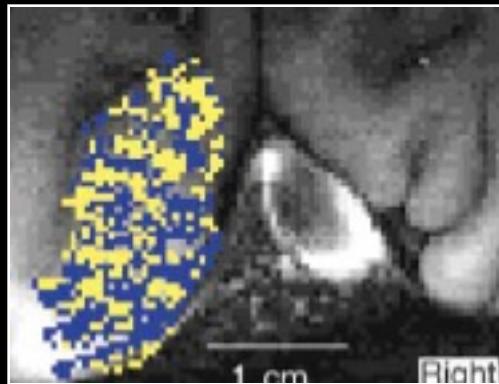
Kang Cheng,<sup>1</sup> R. Allen Waggoner, and Keiji Tanaka  
Laboratory for Cognitive Brain Mapping  
RIKEN Brain Science Institute and  
CREST  
Japan Science and Technology Corporation  
2-1 Hirosawa  
Wako, Saitama 351-0198  
Japan



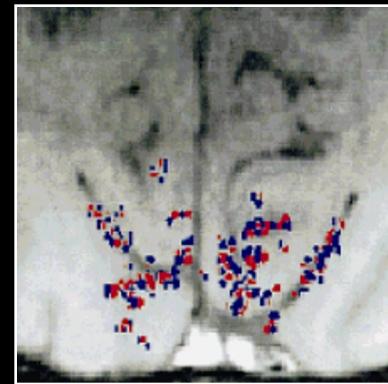
# Ultimate spatial resolution?

Resolving columns with single shot EPI is a goal..

0.47 x 0.47 in plane resolution



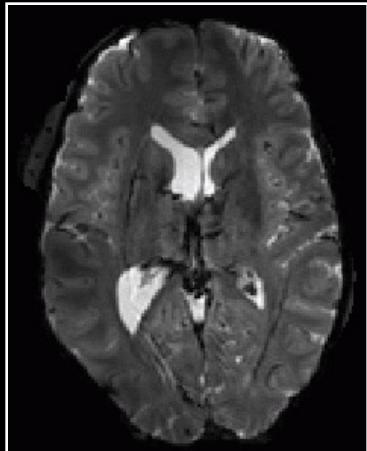
0.54 x 0.54 in plane resolution



Multi-shot with  
navigator pulse

Cheng, et al. (2001) Neuron, 32:359-374

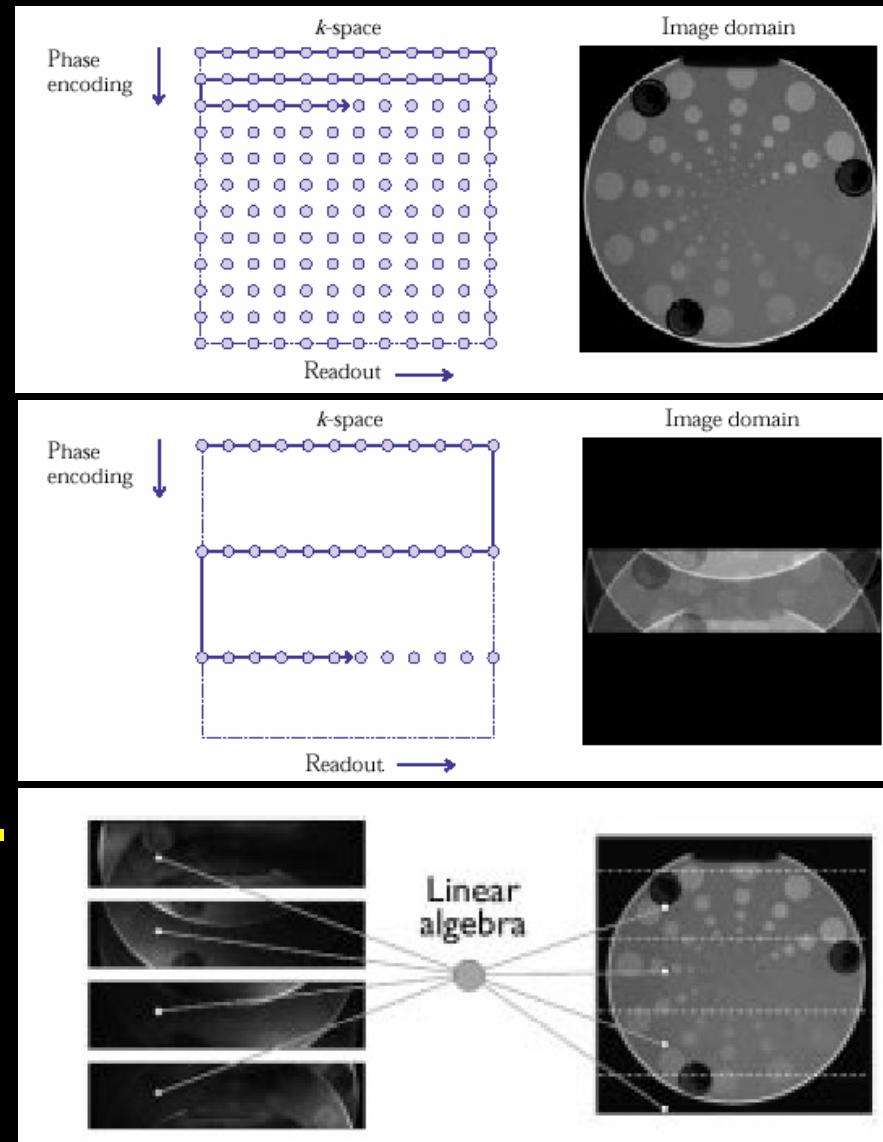
Menon et al, (1999) MRM 41 (2): 230-235



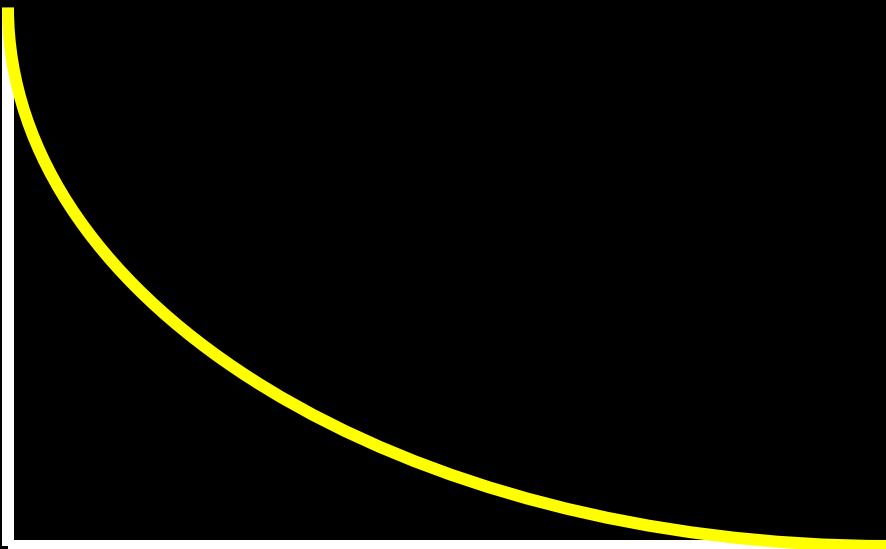
...using SENSE, 32 channels, 7T,  
and perhaps partial k-space we might get to 0.5 mm<sup>3</sup>

3T single-shot SENSE EPI using 16-channels: 1.25x1.25x2mm

# SENSE Imaging



$\approx 5$  to  $30$  ms



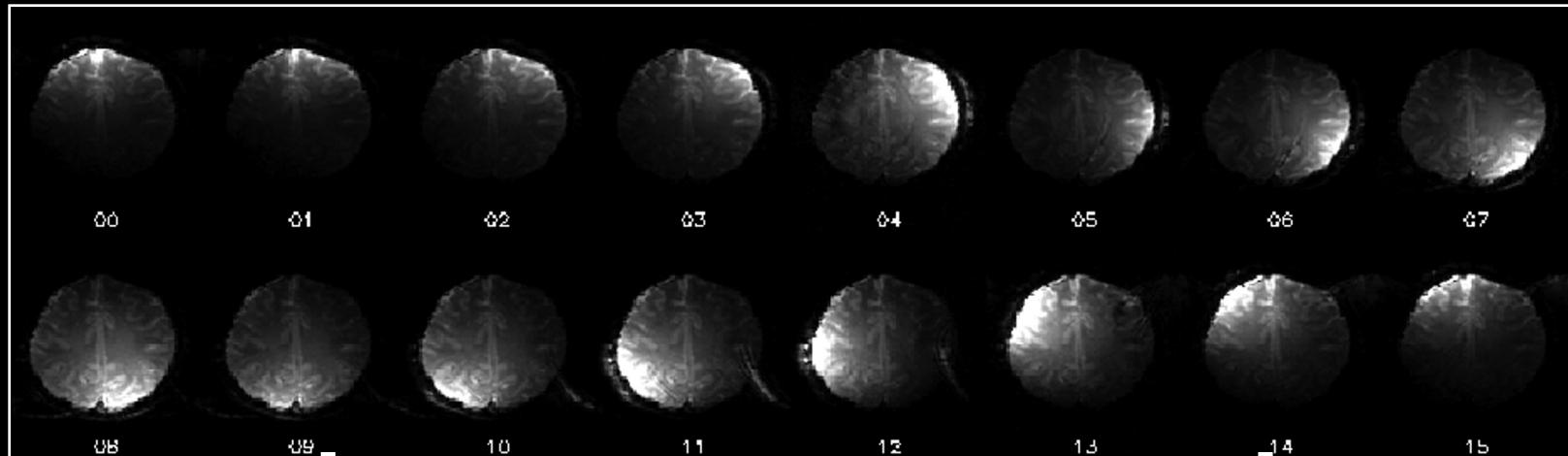
*Parallel acquisition (16 radio frequency channels)*

Custom-built  
Radio-frequency  
(RF) coil

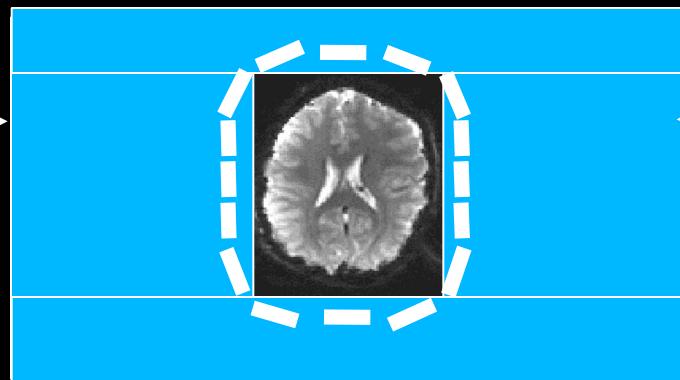


*Nova Medical, Inc.*

## Individual coil images

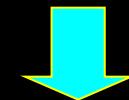
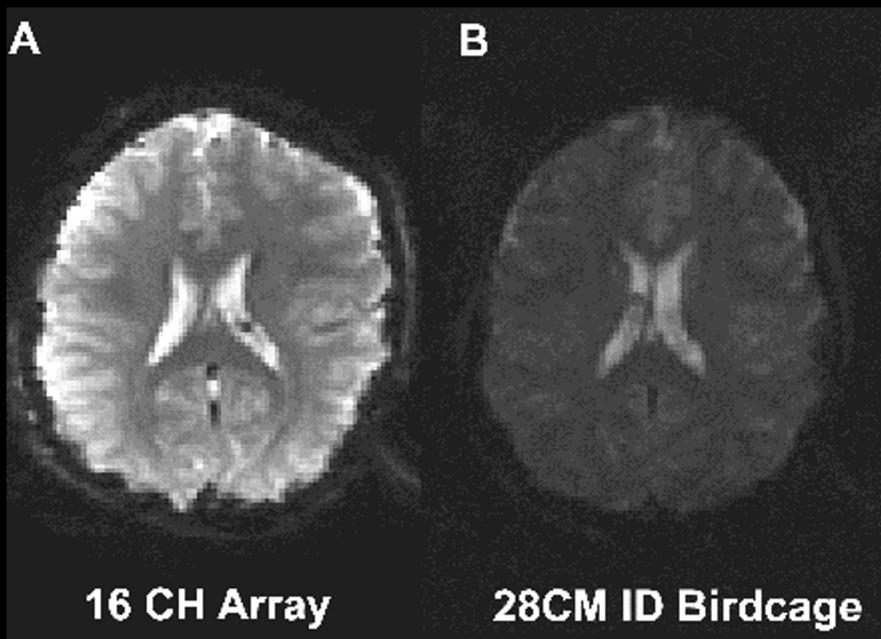


Single combined image



*Parallel acquisition (16 radio frequency channels)*

Large improvement in signal-to-noise ratio (SNR)



- Increased resolution
- Increased imaging speed
- Increased sensitivity

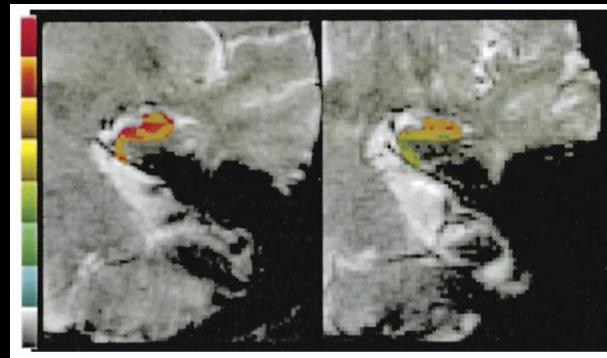
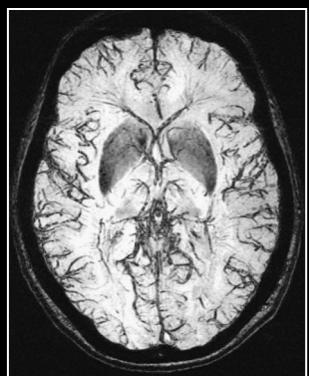
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# Ultimate clinical utility?

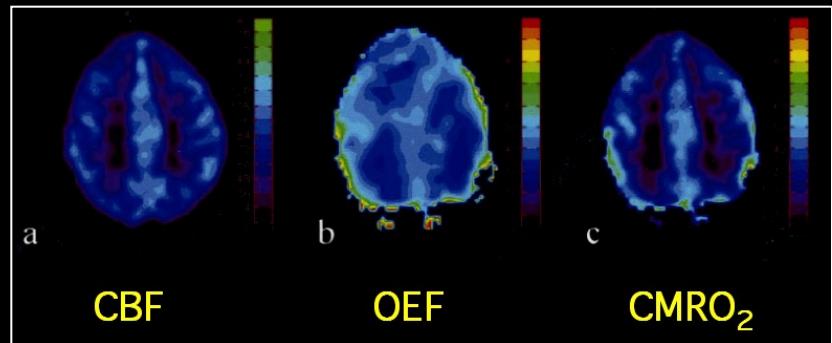
Needs:

- Real time feedback
- Characterization of confounding effects
- Robust yet incisive set of probe tasks
- Baseline information?



Small, et al (2001), Neuron 28:853-664

Bove-Bettis, et al (2004), SMRT



Bartha, et al (2002), MRM 47:742-750

An, et al (2001), NMR in Biomedicine 14:441-447

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Best processing and display methods?

## Processing

fMRI data, and noise is time and space varying in predictable and unpredictable ways over several temporal and spatial scales...

Signal and noise models...

Model free, open ended, methods?

Classification methods?

Multivariate methods?

Connectivity (across time and space scales?)

# Best processing and display methods?

## Display

To convey:

- collapsed multidimensional data
- sense of data quality

Surface

Glass brain

ROI

Time courses

Example slices

Connectivity maps?

“Quality” index?

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## Optimal Field Strength?

### Utility vs. Difficulty

#### Difficulty:

- Shimming (generally lower T2 and T2\*)
- RF penetration effects
- Stability

#### Utility:

- Higher SNR
- Better susceptibility contrast
- Better ASL perfusion contrast (longer T1)



# Functional Imaging Methods Unit &



## Functional MRI Facility

### Computer Specialist:

Adam Thomas

### Scanning Technologists:

Karen Bove-Bettis

Paula Rowser

Alda Ottley

Ellen Condon

### Staff Scientists:

Sean Marrett

Jerzy Bodurka

Frank Ye

Wen-Ming Luh

Rasmus Birn

### Program Assistant:

Kay Kuhns

### Post Docs:

Hauke Heekeren

David Knight

Anthony Boemio

Niko Kriegeskorte

### Graduate Student:

Natalia Petridou

# Unit on Functional Imaging & FMRI Core Facility



<http://sodium.nimh.nih.gov/upload>  
**T165.ppt**