

Paradigms, Pulse Sequences, and Processing:

Pushing the Limits with fMRI

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



- Brief summary of fMRI
- Where the technology has taken us
- Neuronal Activity and Hemodynamics
- Demystifying "Brain reading" and multivariate analysis
- Open questions and future directions...

• Brief summary of fMRI

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MRI vs. fMRI

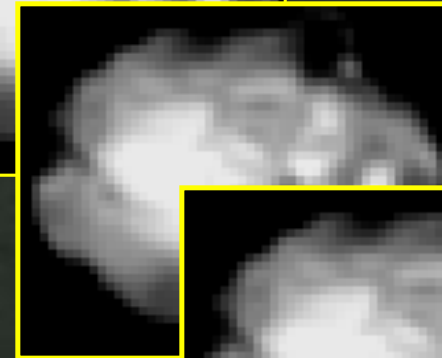
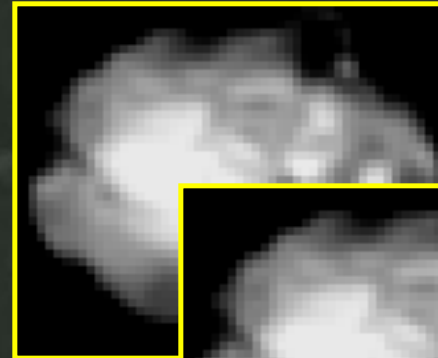
MRI



one image

high resolution
(1 mm or less)

fMRI

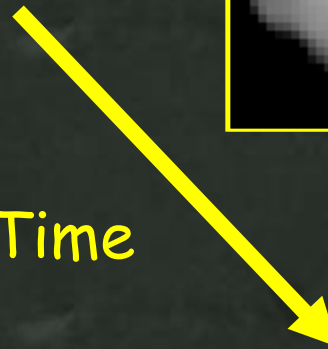


...

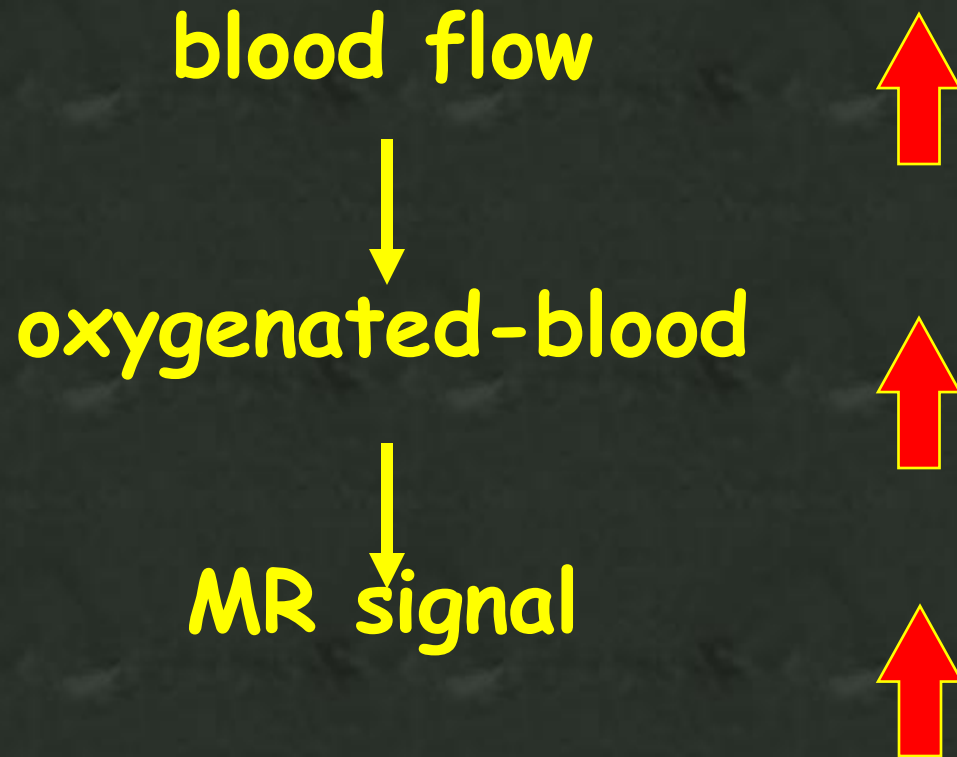
many images
(e.g., every 2 sec for 5 mins)

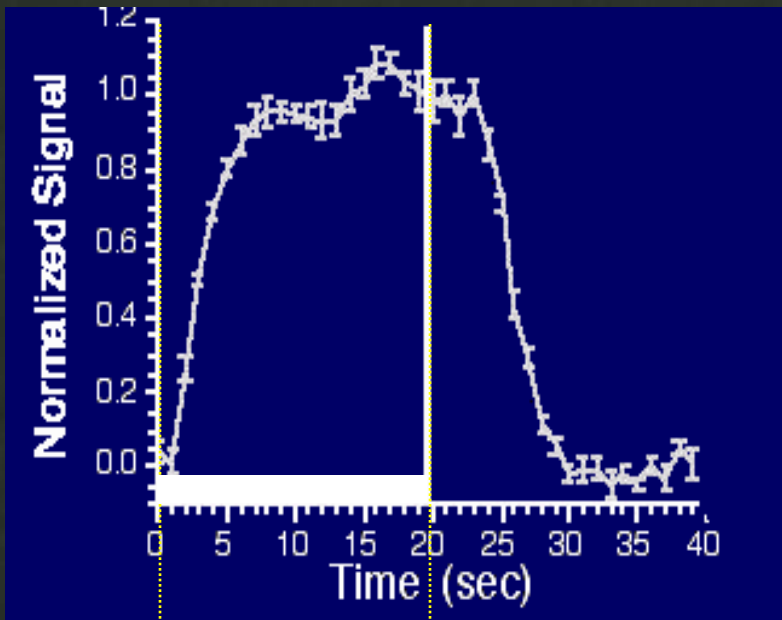
low resolution
(1.5 to 4 mm)

Time

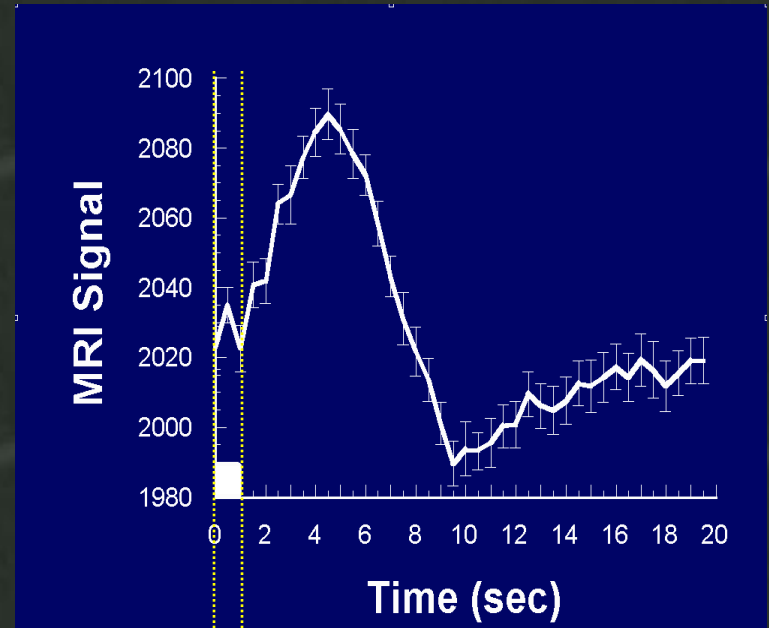


BOLD (Blood Oxygen Level Dependent) Contrast





task

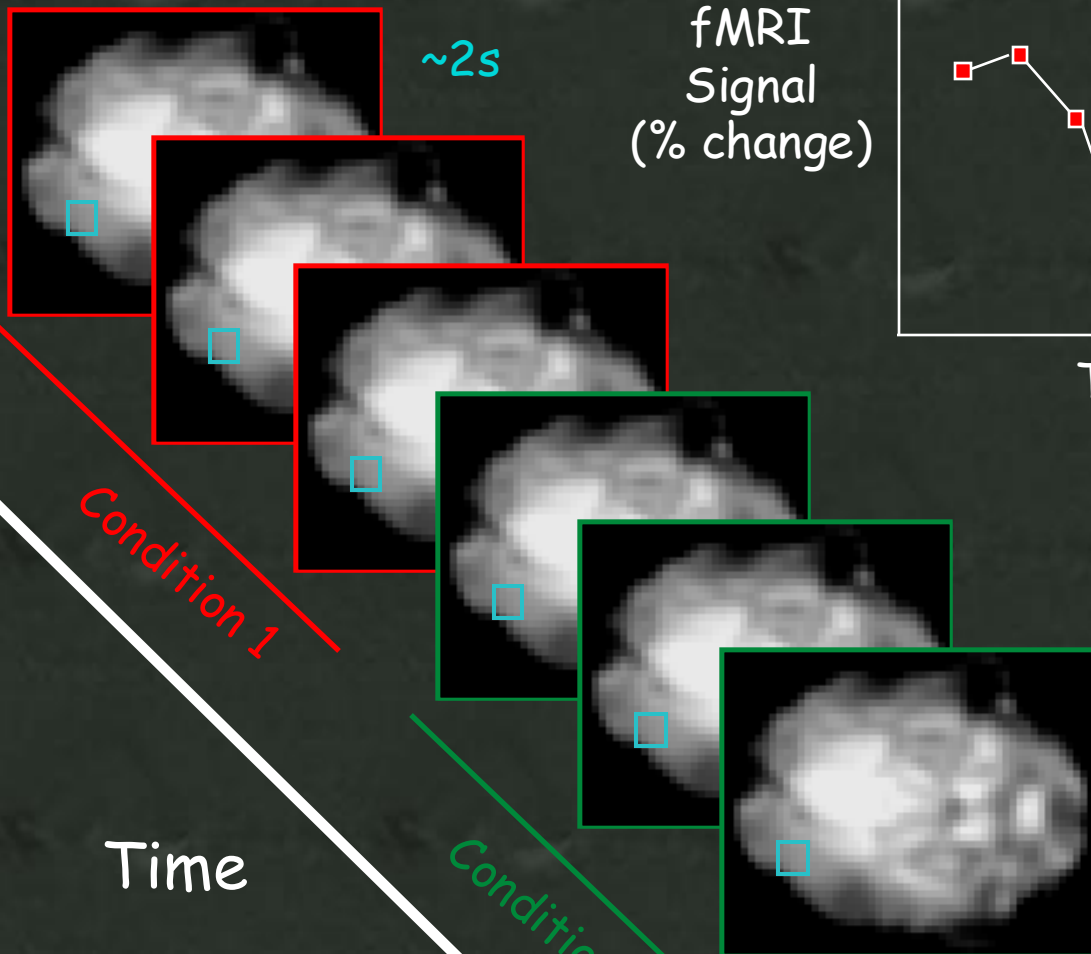


task

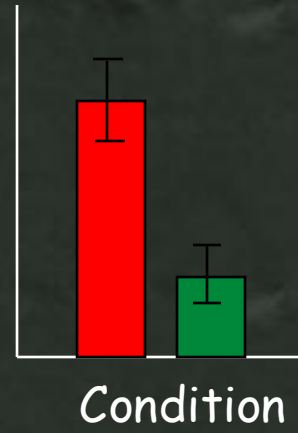
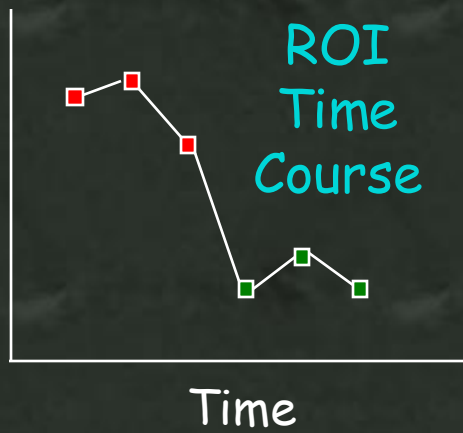


1991

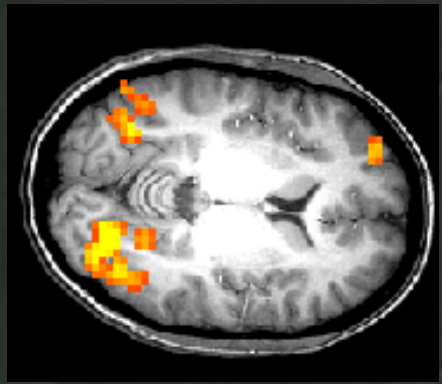
Functional images



fMRI
Signal
(% change)



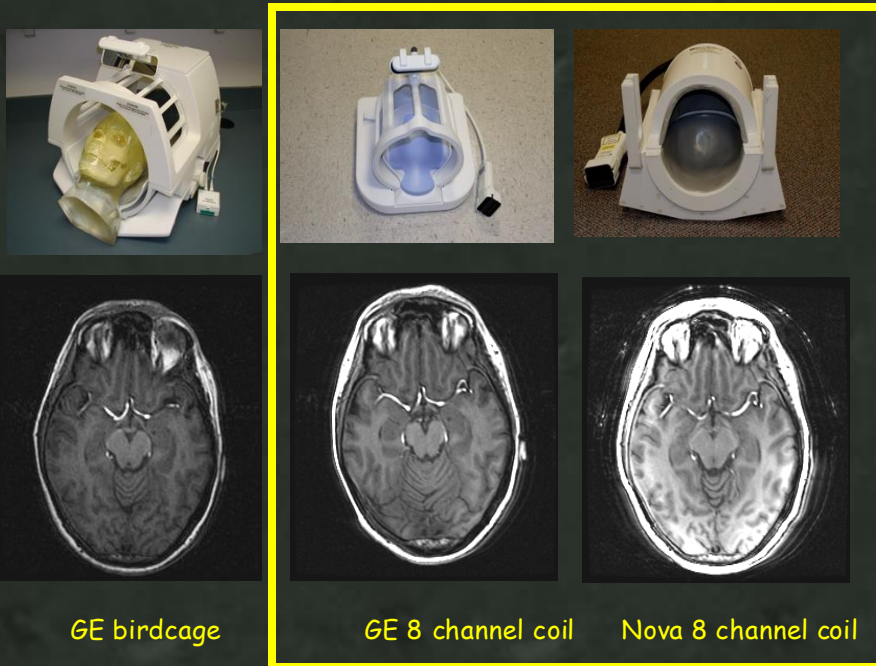
Statistical Map
superimposed on
anatomical MRI image



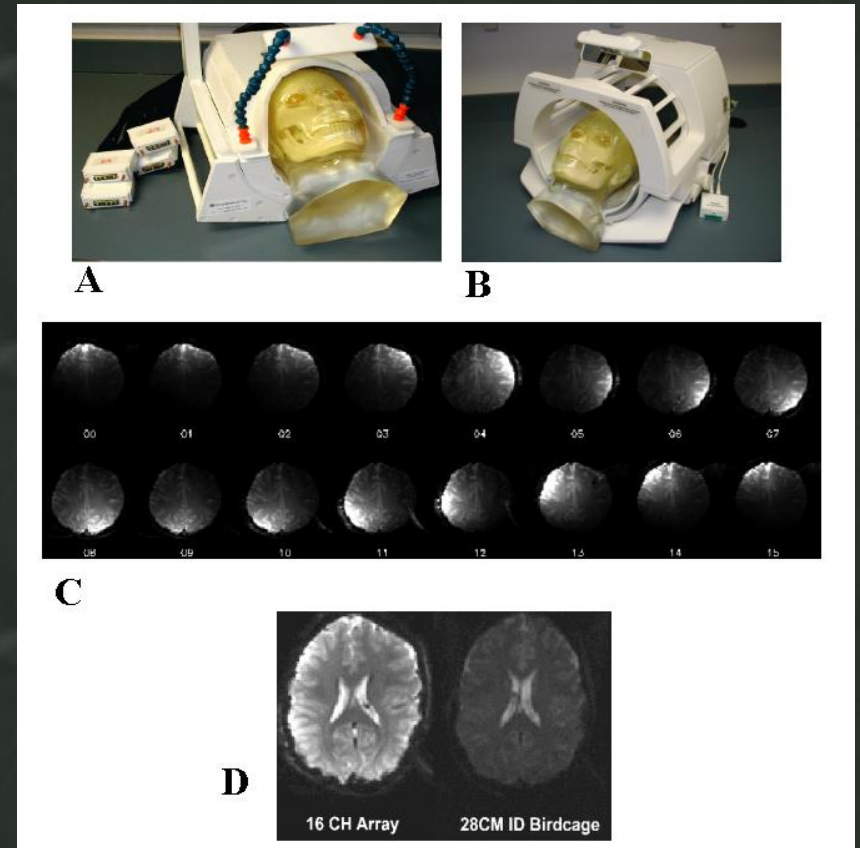
Region of interest (ROI)

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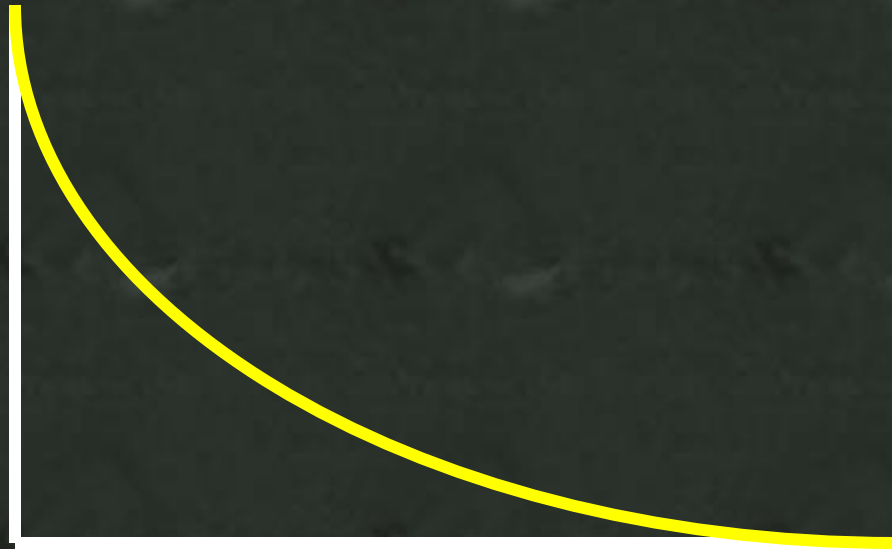
8 channel parallel receiver coil



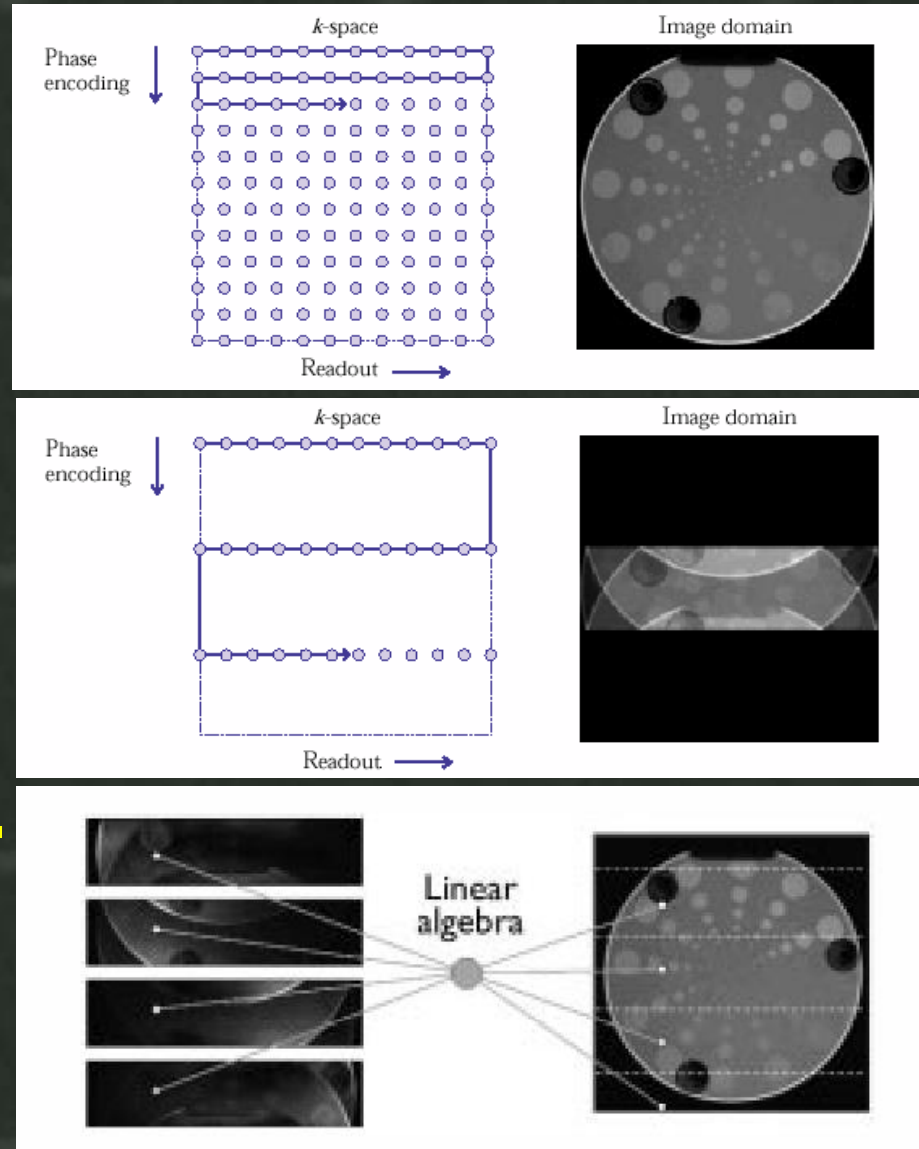
16 channel parallel receiver coil



SENSE Imaging

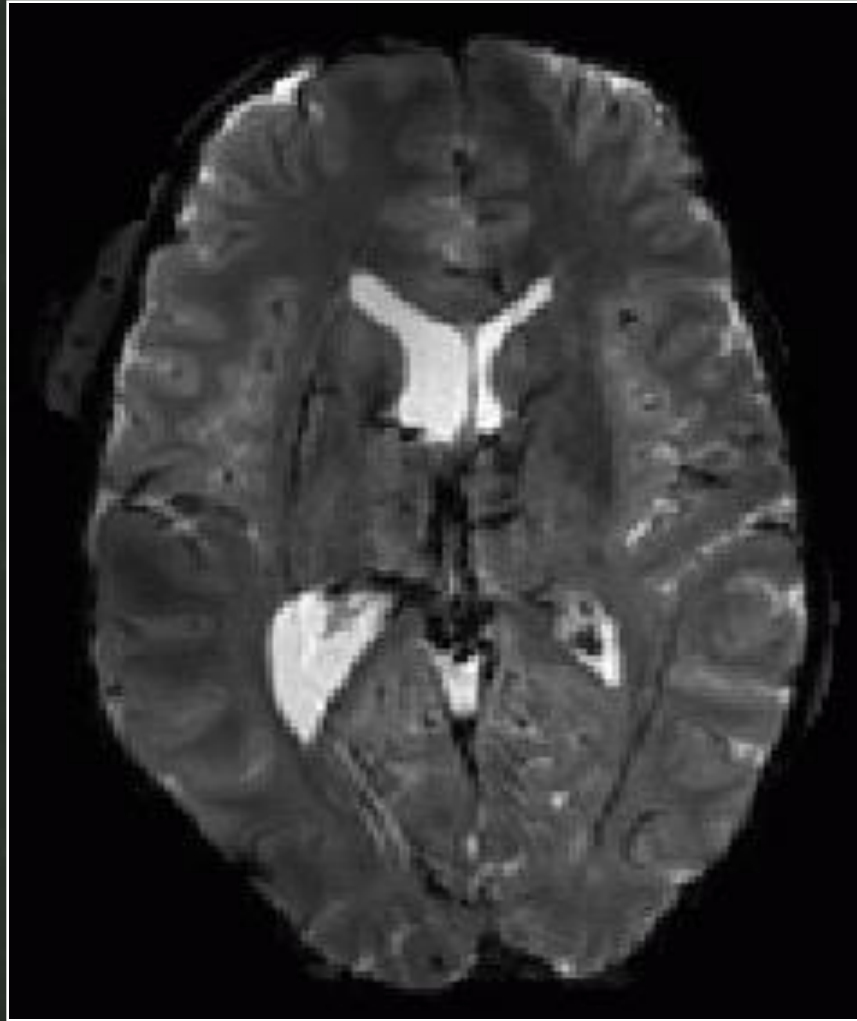


≈ 5 to 30 ms



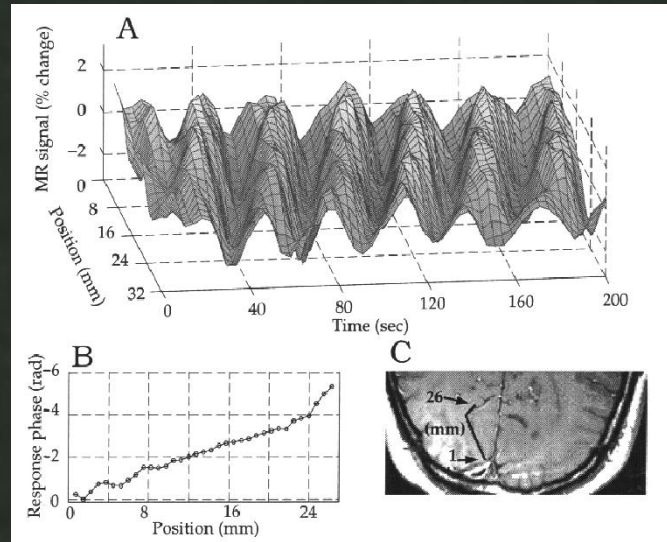
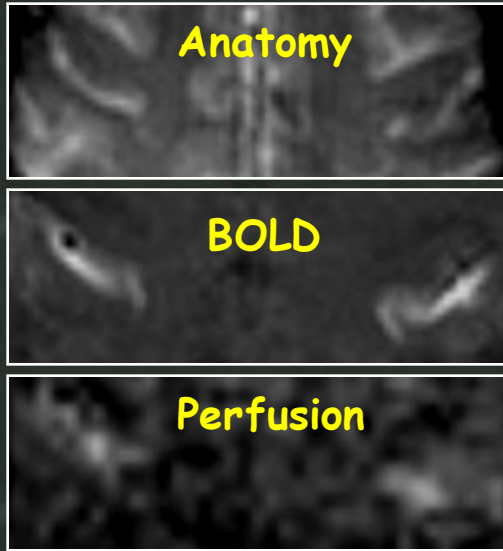
Pruessmann, et al.

SENSE Imaging



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

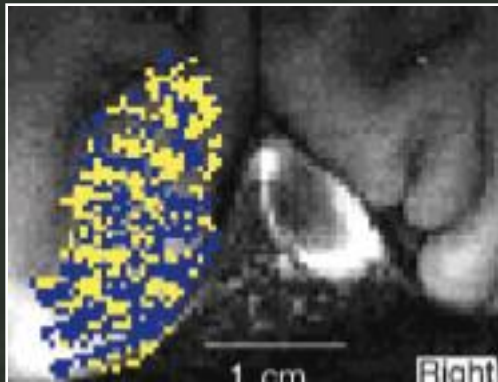
PSF FWHM = 3.5mm



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

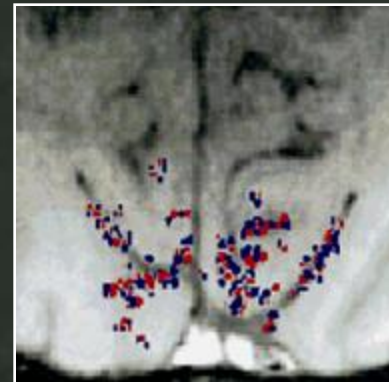
S.A. Engel, et al. Investigative Ophthalmology & Visual Science 35 (1994) 1977-1977.

0.47 x 0.47 in plane resolution



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

0.54 x 0.54 in plane resolution

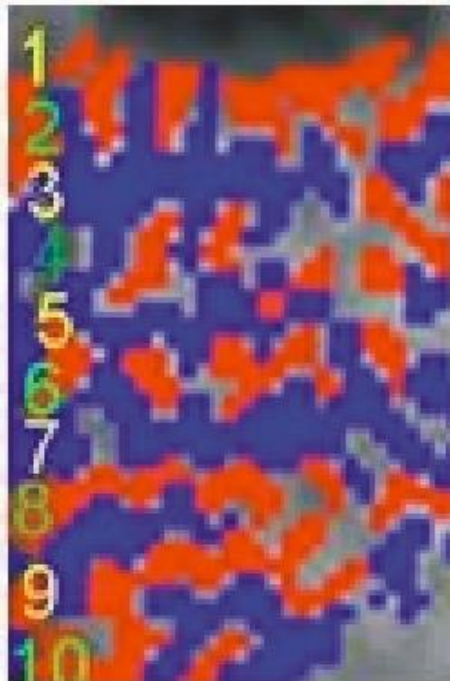


Multi-shot with navigator pulse

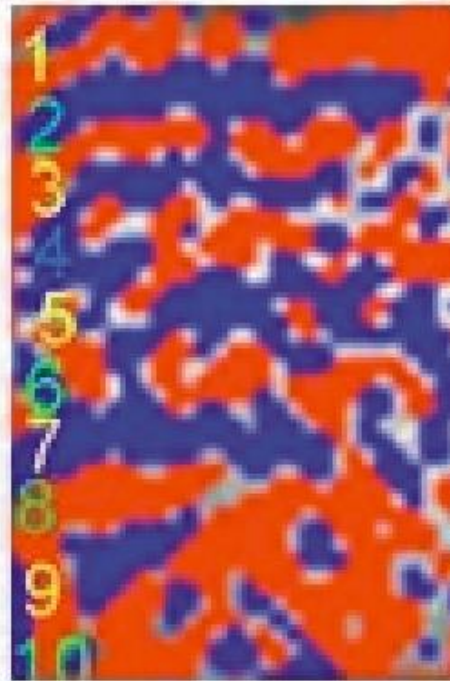
Menon et al, (1999) MRM 41 (2): 230-235

HSE-BOLD demonstration of ocular dominance columns

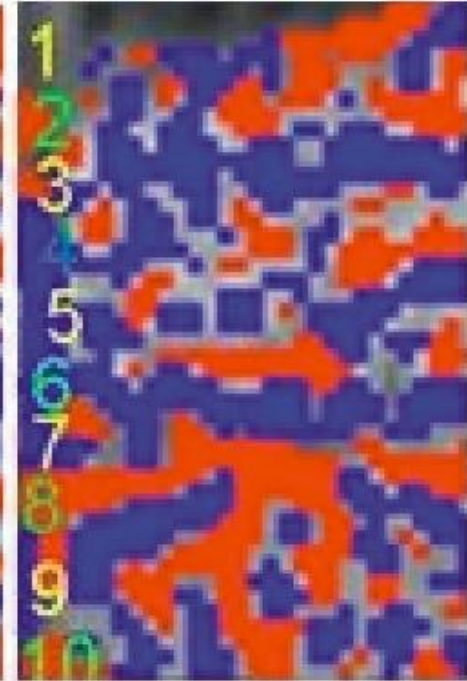
human, 7T, $0.5 \times 0.5 \times 3$ mm³



day 1



day 2



day 3

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

Three challenges posed by hi-res fMRI

1. fine-scale neuronal activity patterns may be inaccurately depicted (although irregularly spaced subvoxel patterns are able to be detected).
2. small voxels yield noisy responses (and spatial smoothing would lower resolution)
3. voxel-to-voxel interindividual correspondency mapping unknown. (standard normalization, and averaging across subject doesn't work)

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Neuronal Activation

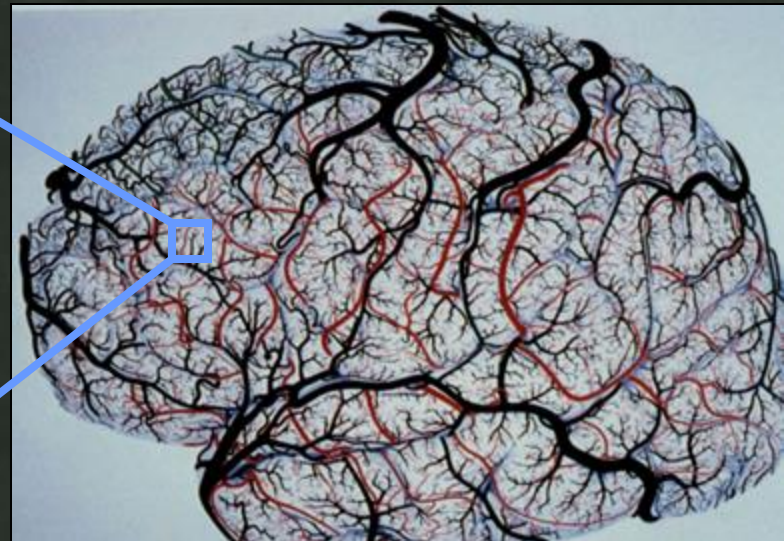
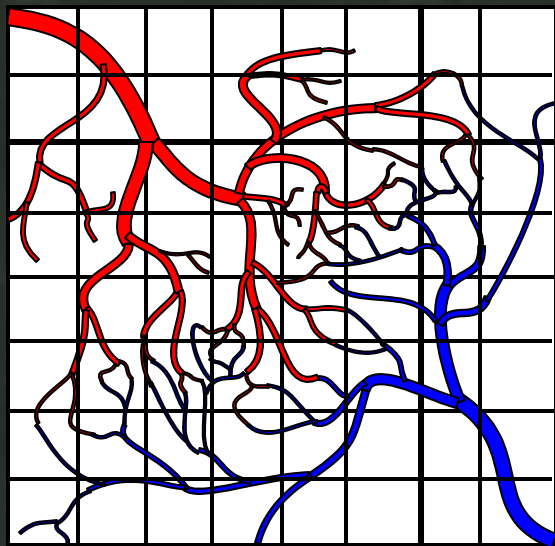
Measured Signal



Hemodynamics



Noise



What we know about fMRI signal changes:

- fMRI amplitude is proportional to neuronal activity (synaptic activity)
- Other variables influence signal: blood volume in each voxel, field strength, pulse sequence...
- Δ flow, Δ oxygenation, and Δ volume are controlled on spatial scale of neuronal activity (columns) but do not necessarily correspond in a precise manner spatially.

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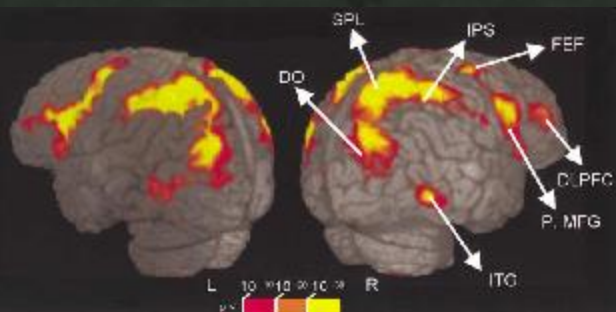
Mapping



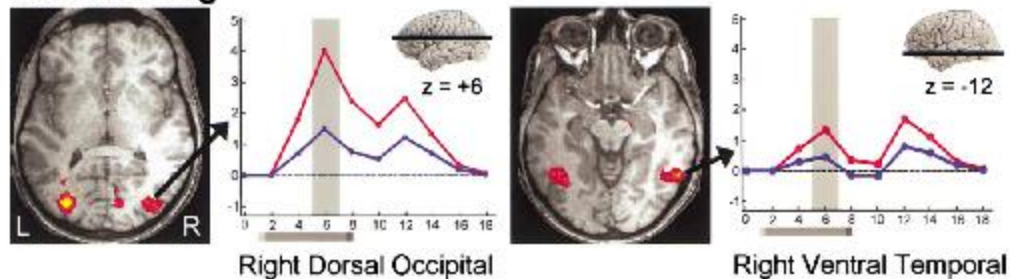
"Reading"

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

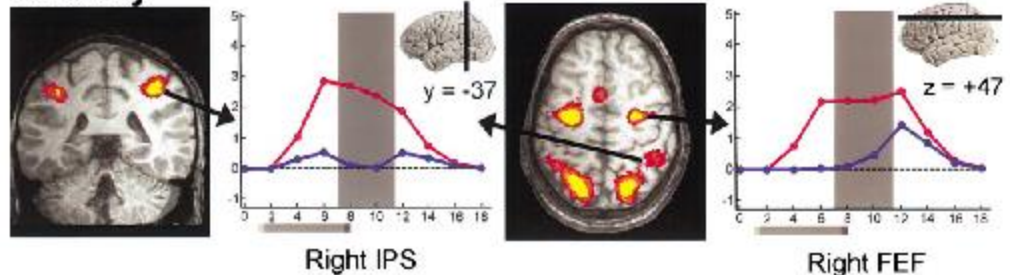
Luiz Pessoa,¹ Eva Gutierrez, Peter A. Bandettini,
and Leslie G. Ungerleider
Laboratory of Brain and Cognition
National Institute of Mental Health
National Institutes of Health
Bethesda, Maryland 20892



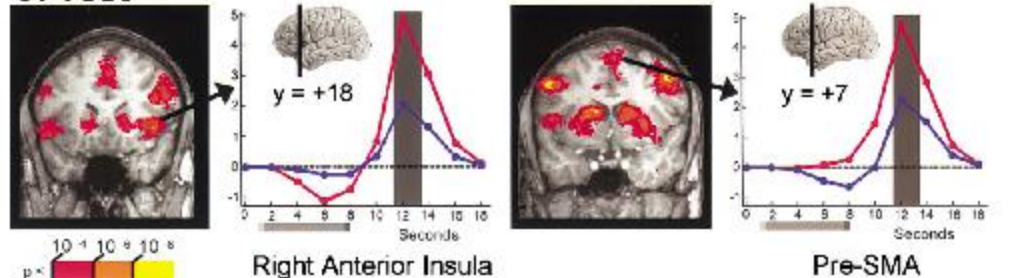
A. Encoding



B. Delay

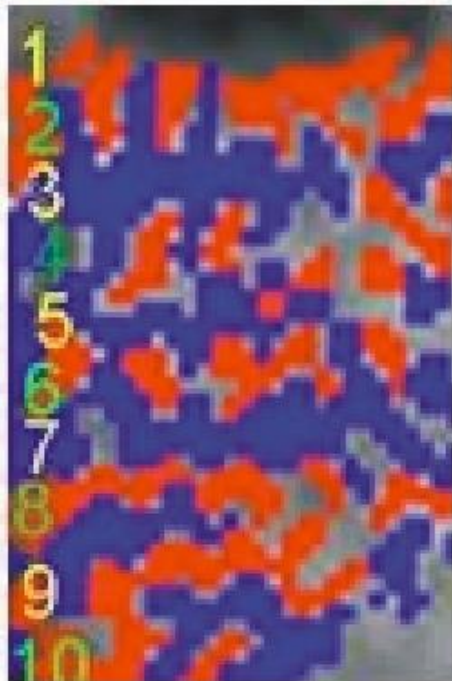


C. Test

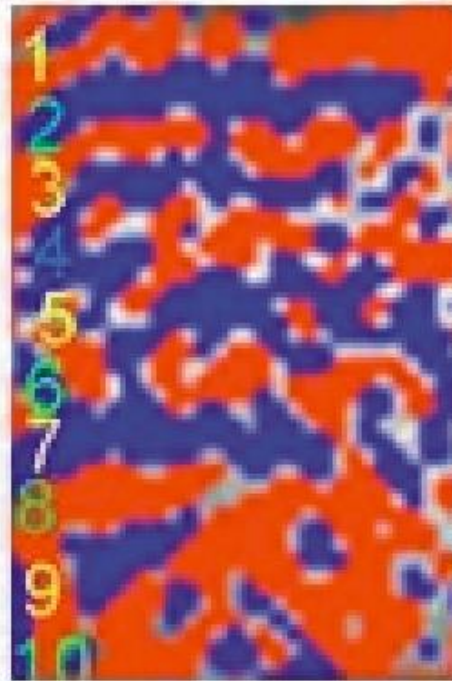


HSE-BOLD demonstration of ocular dominance columns

human, 7T, $0.5 \times 0.5 \times 3$ mm³



day 1



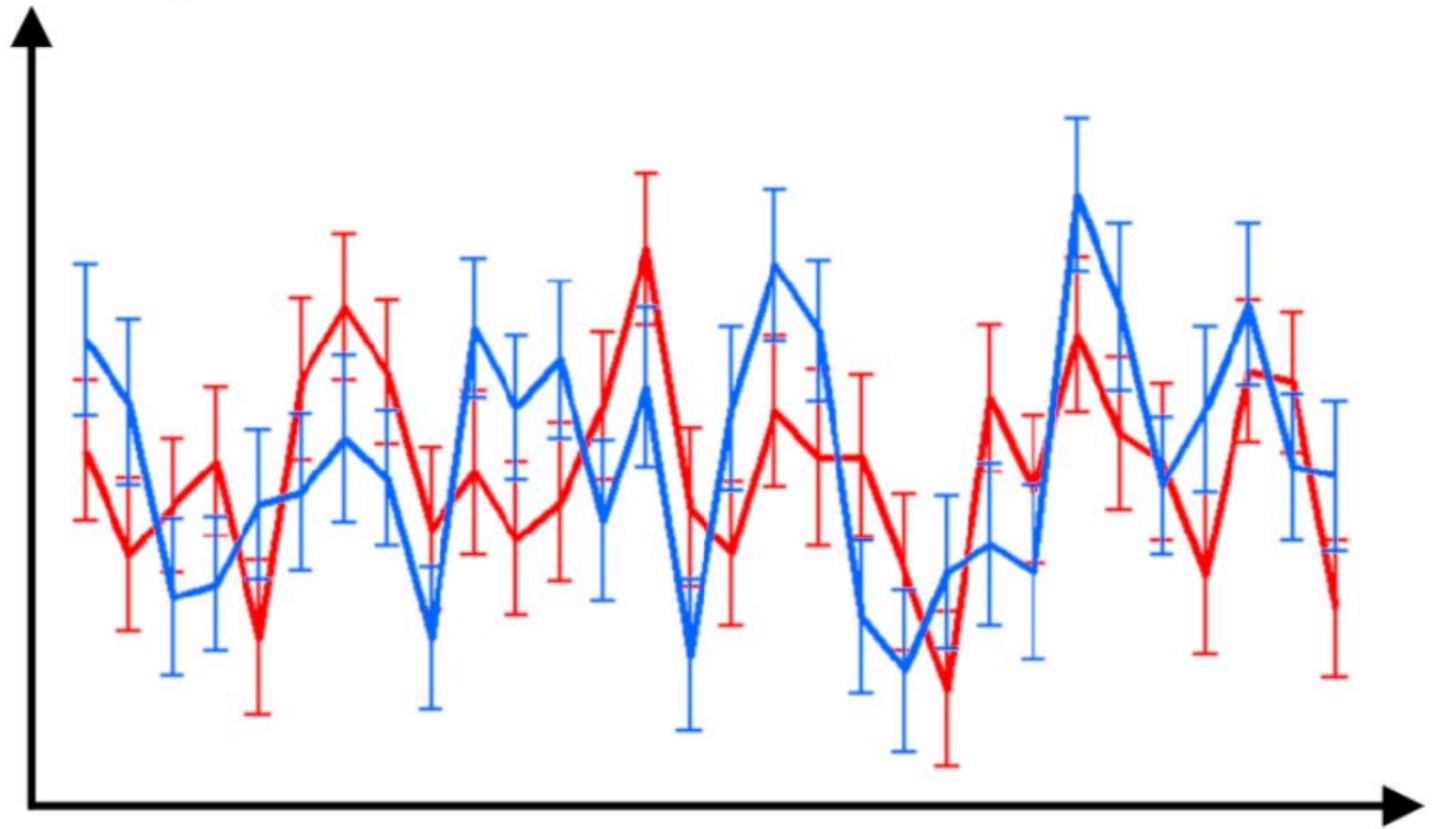
day 2



day 3

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

activity



space

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

David D. Cox^{a,b,*} and Robert L. Savoy^{a,b,c}

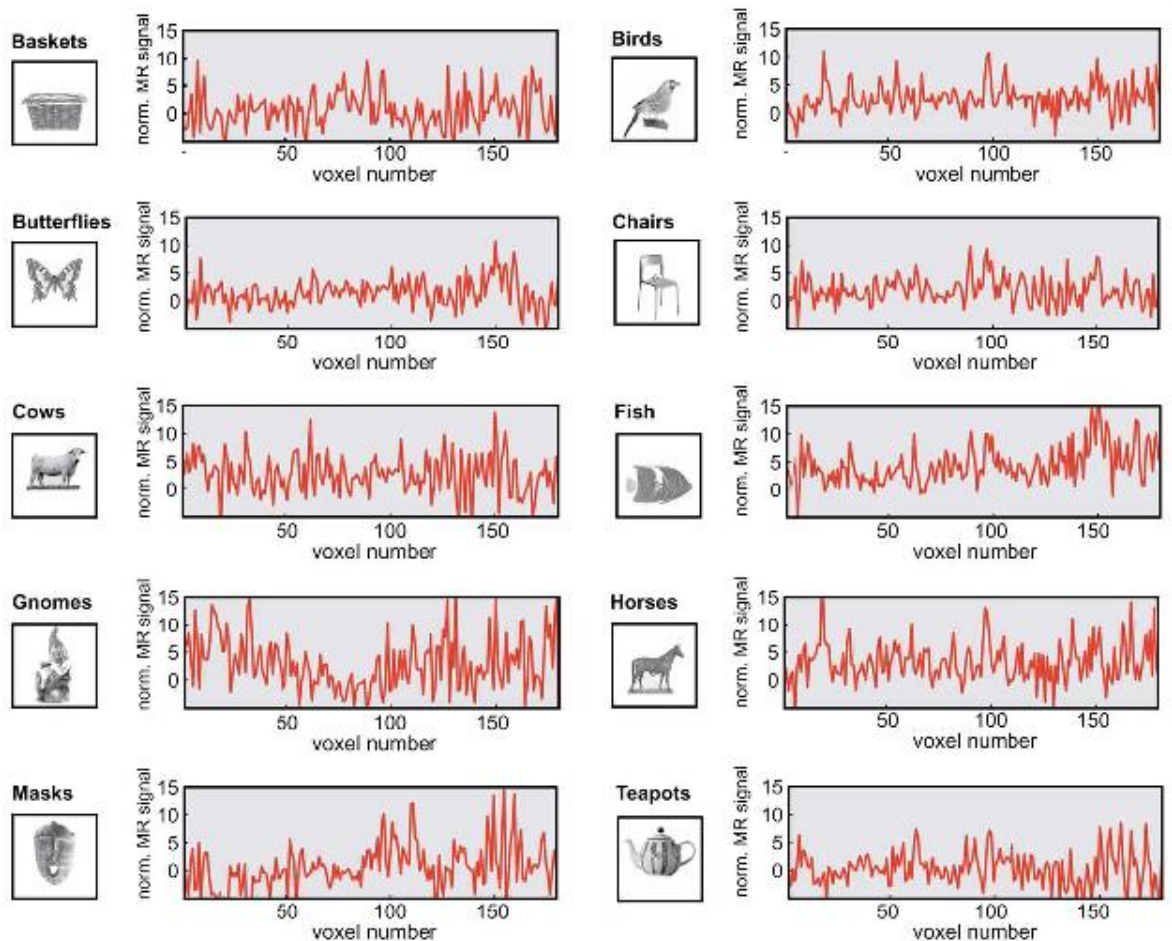
^a Rowland Institute for Science, Cambridge, MA 02142, USA

^b Athinoula A. Martinos Center for Structural and Functional Biomedical Imaging, Charlestown, MA 02129, USA

^c HyperVision, Inc., P.O. Box 158, Lexington, MA 02420, USA

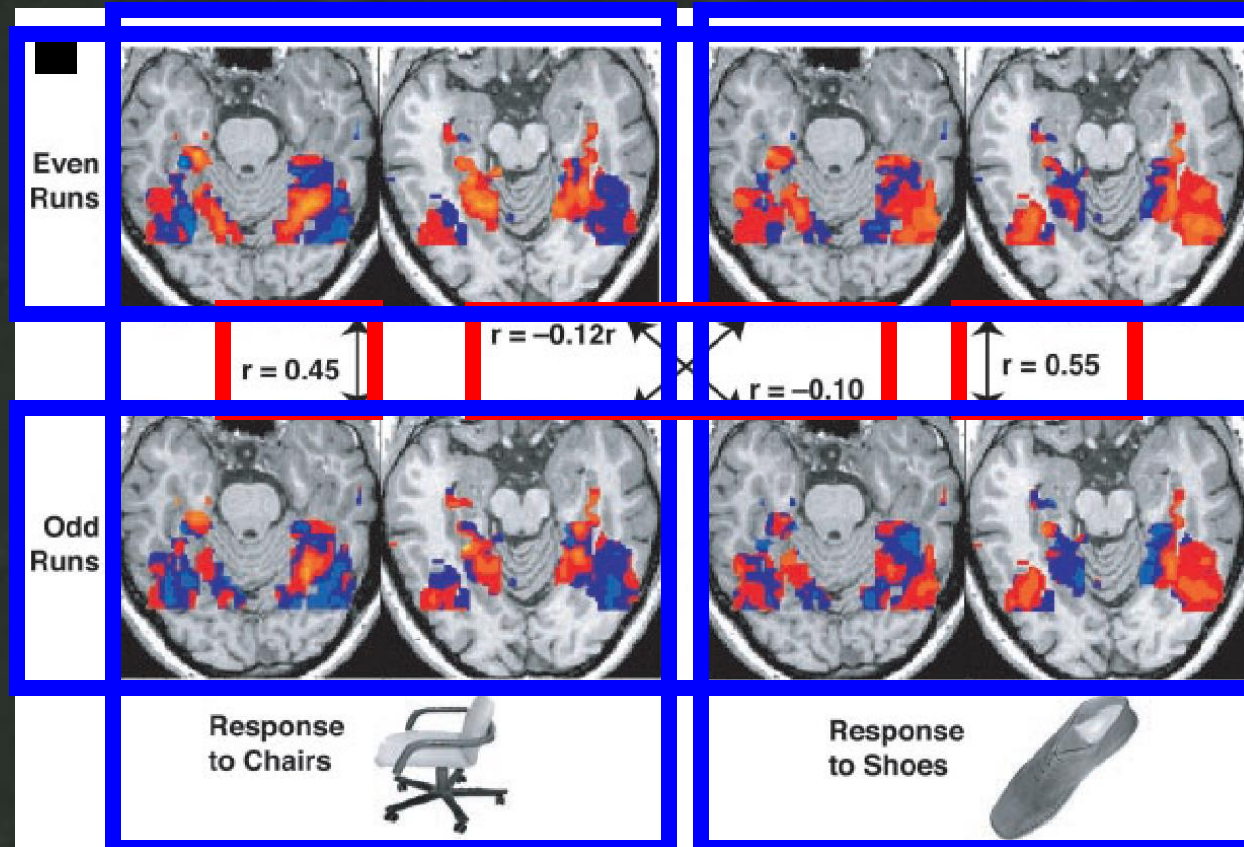
Received 15 July 2002; accepted 10 December 2002

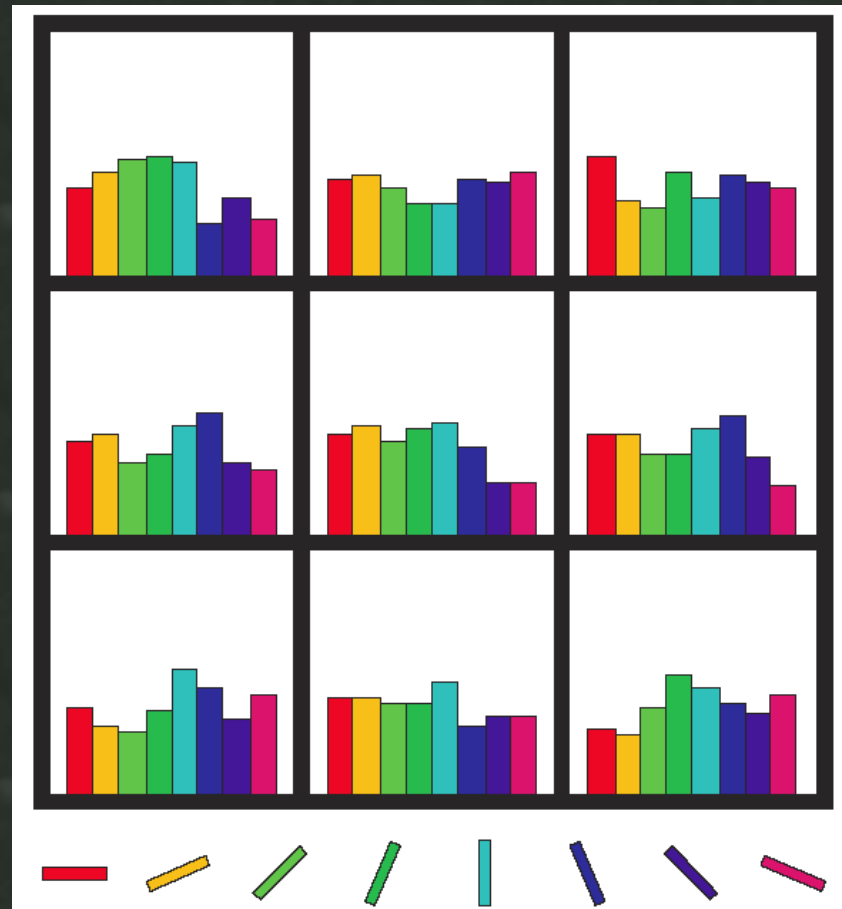
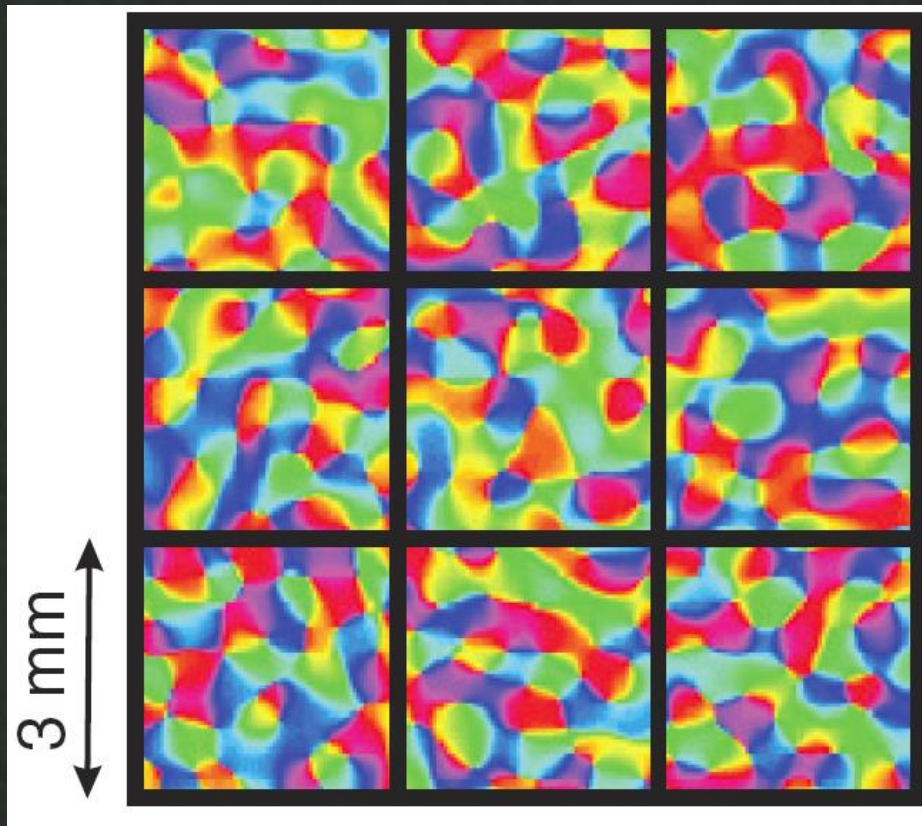
NEUROIMAGE 19 (2): 261-270 Part 1 JUN 2003



Ventral temporal category representations

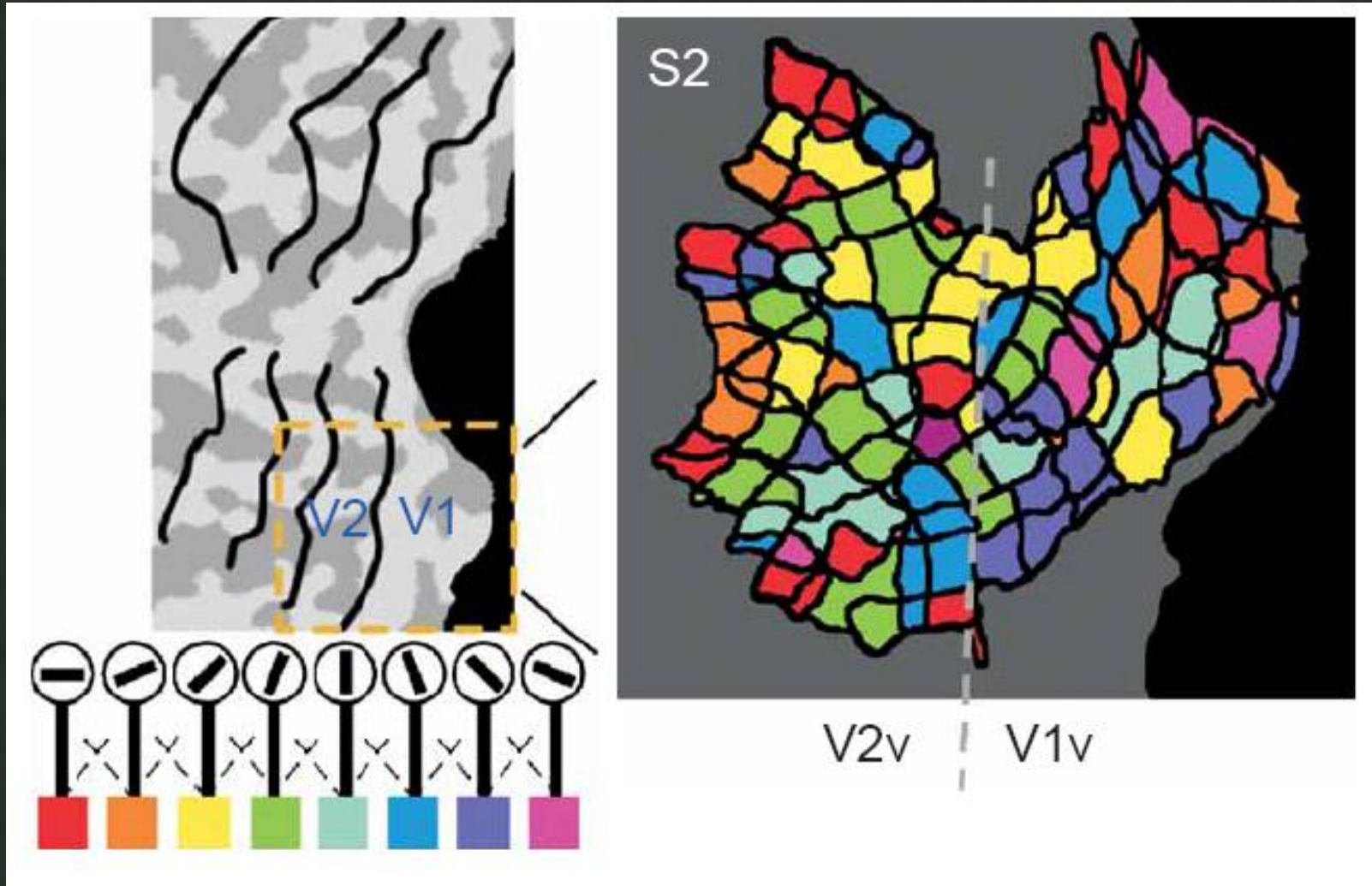
- Object categories are associated with distributed representations in ventral temporal cortex
 - Present photos of common objects blocked by category.
 - Use fMRI to measure the pattern of high and low responses across large areas of ventral temporal cortex.
 - Observe stable, distributed "category representations"



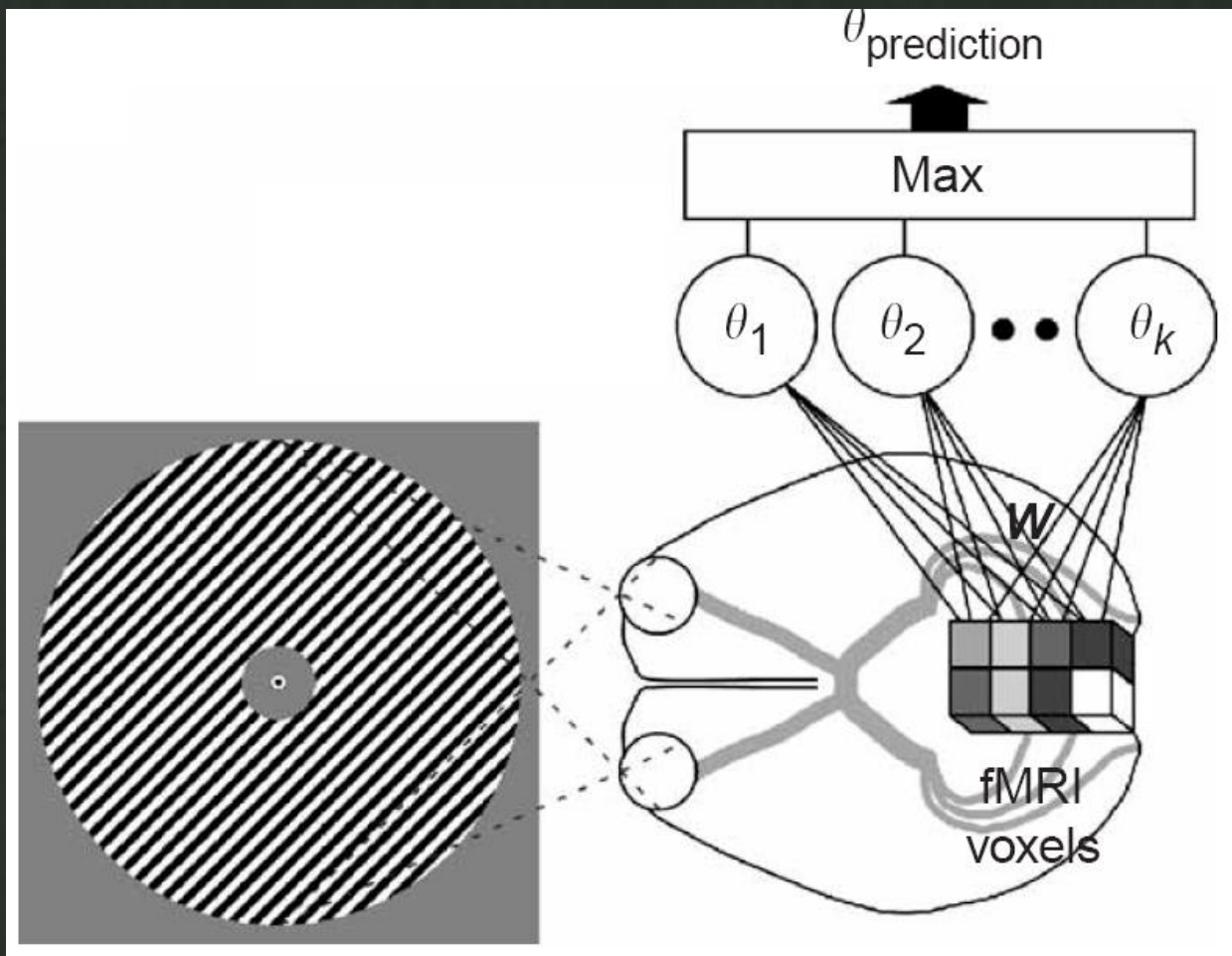


Boynton (2005), News & Views on Kamitani & Tong (2005) and Haynes & Rees (2005)

Lower spatial frequency clumping



Iso-orientation domains are not resolved,
but the viewed orientation can be predicted



Mapping vs Prediction

- they are opposite sides of the same thing
- prediction/repeat correlation are used when maps are less obvious (which is more often as columnar organization is assessed)
- prediction/repeat correlation establish that the patterns contain information

Univariate vs Multivariate

- taking the entire activation pattern over space as a whole substantially increases detection/prediction power

Pattern-recognition analysis of fMRI activity patterns

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

1. fine-scale neuronal activity patterns may be inaccurately depicted (although irregularly spaced subvoxel patterns are able to be detected) (no longer look like "blobs" - no longer "mapping")
2. small voxels yield noisy responses (multivariate) (and spatial smoothing would lower resolution)
3. voxel-to-voxel interindividual correspondency mapping unknown. (standard normalization, and averaging across subject doesn't work) (we need a new method)

Multivariate Searchlight Approach

Kriegeskorte et al.



statistical mapping

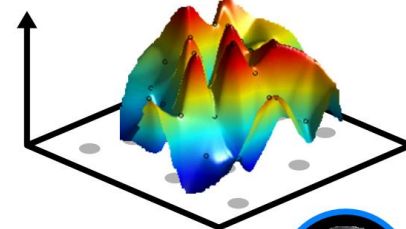
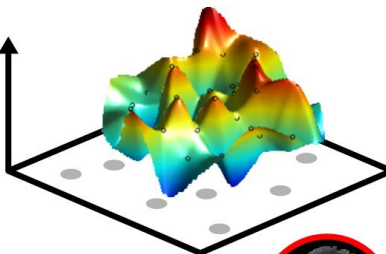
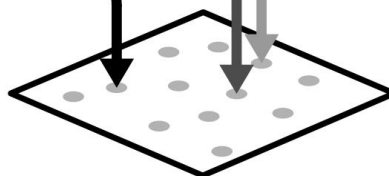
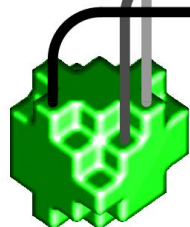
ROI

voxel positions

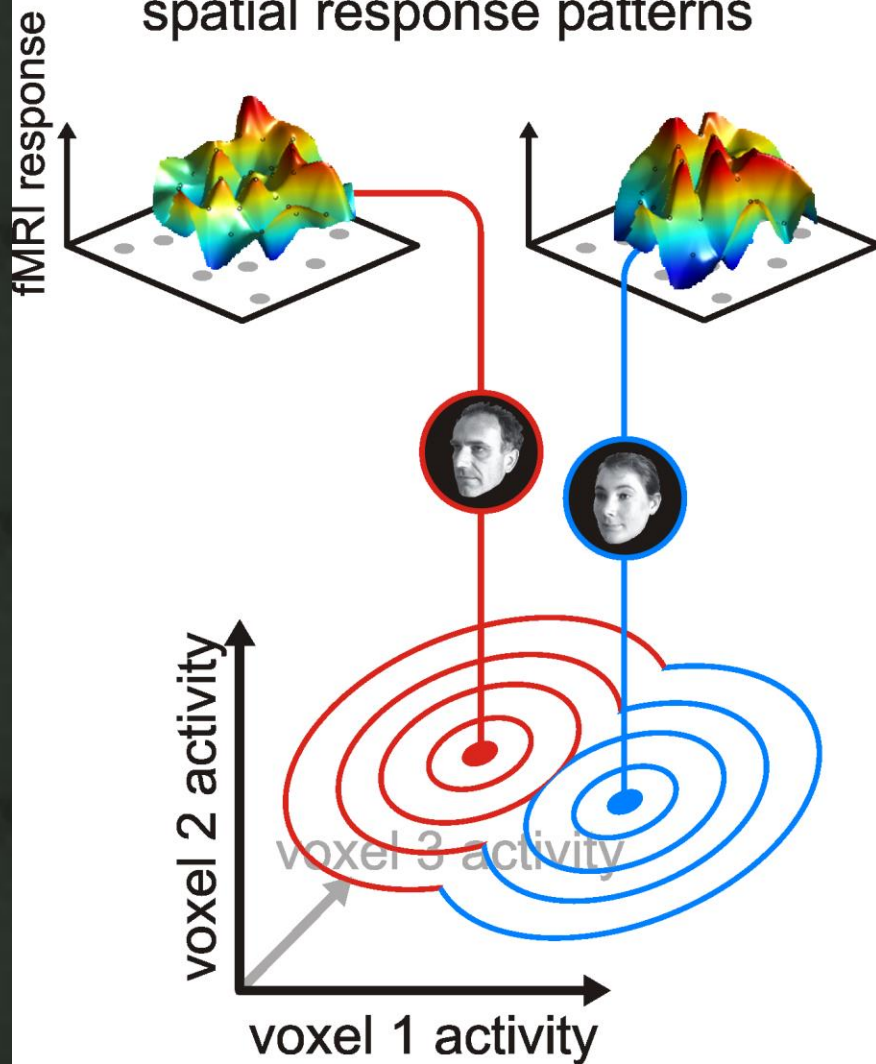
regional cortical flatmap

fMRI response

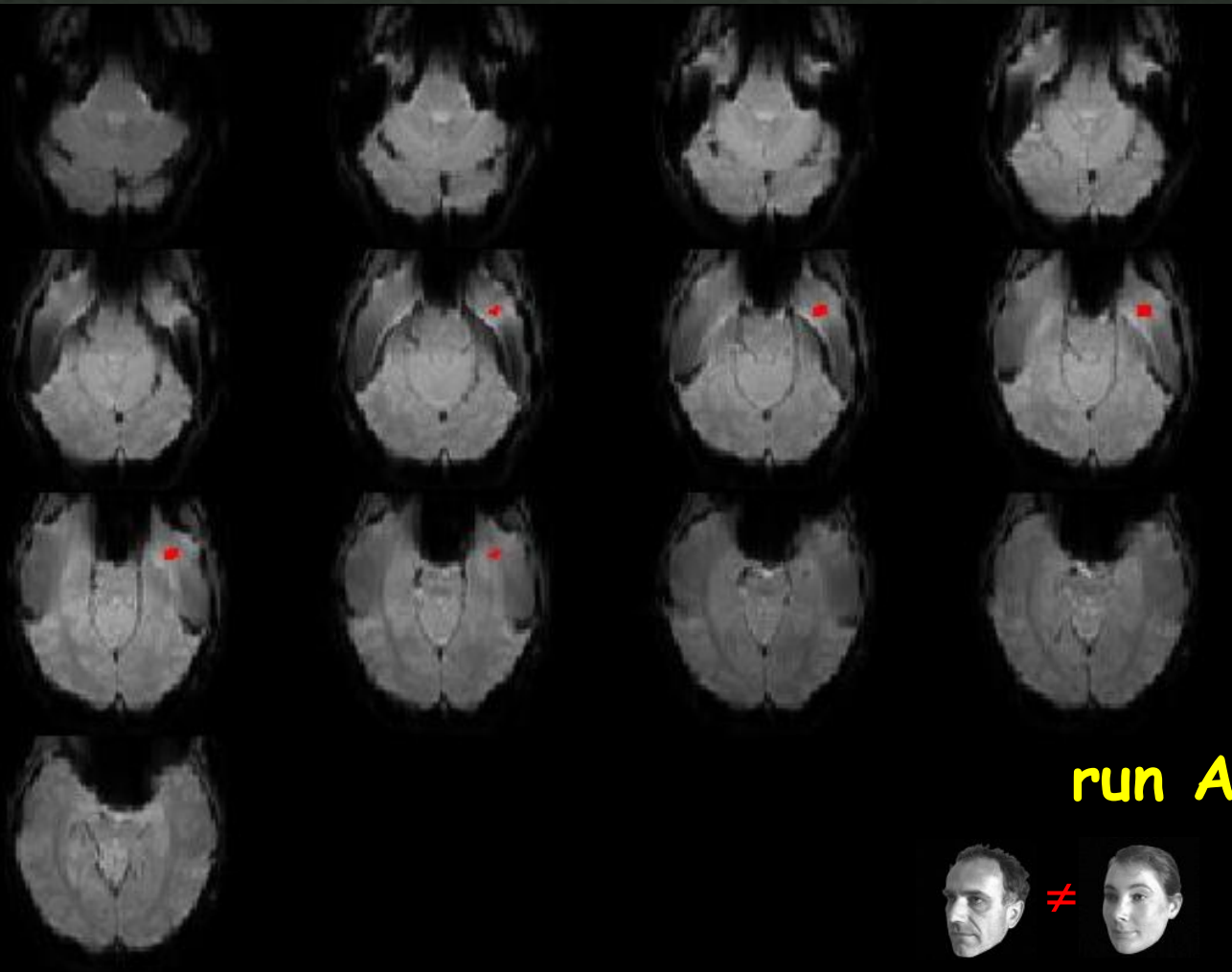
event-related spatial response patterns



event-related spatial response patterns



Anterior inferotemporal face-exemplar region

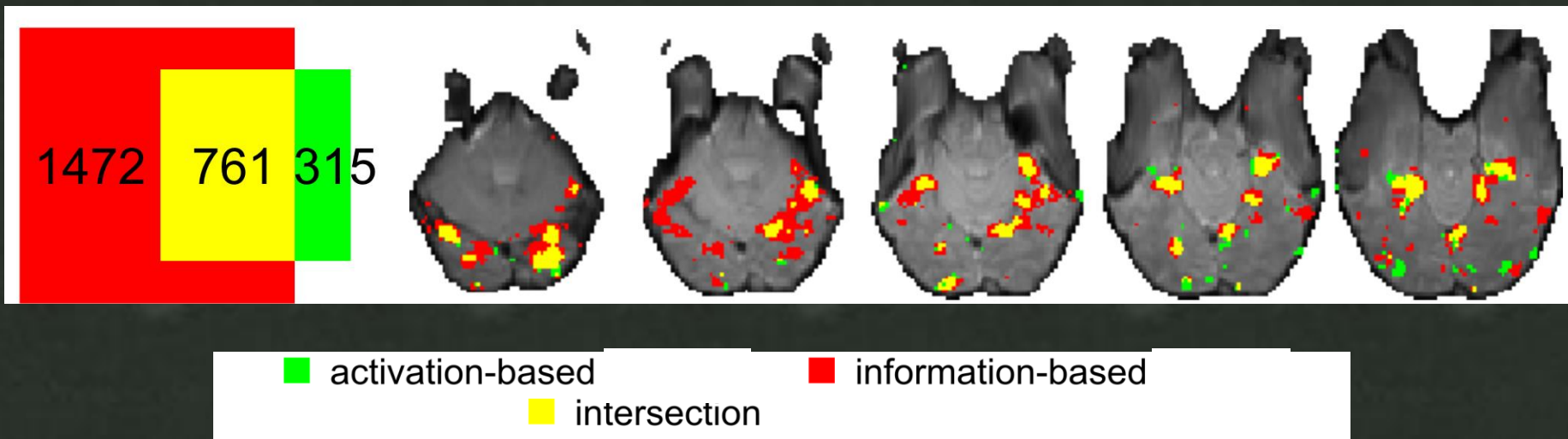


run B

Talairach: 33, -8, -33

spatial mean removed, fisherAtestB: single-sided test and info estimate

Application to Typical fMRI data to increase sensitivity

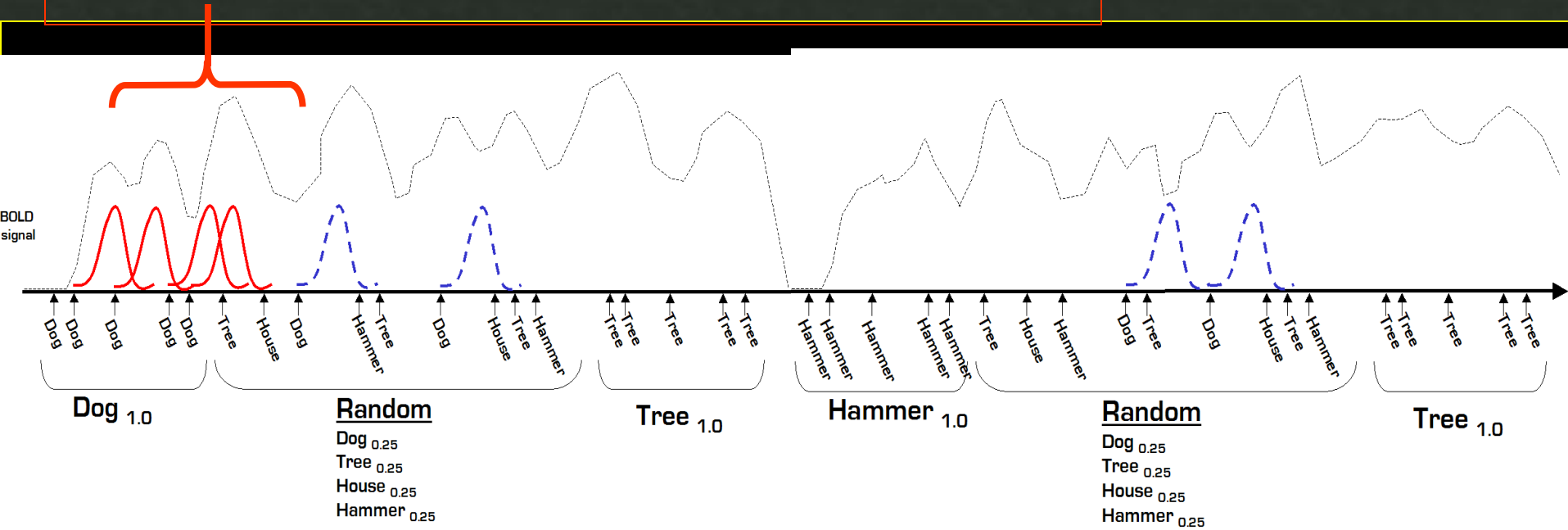


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Category expectations alter ventral temporal category representations

W. Kyle Simmons
Lawrence W. Barsalou
Emory University

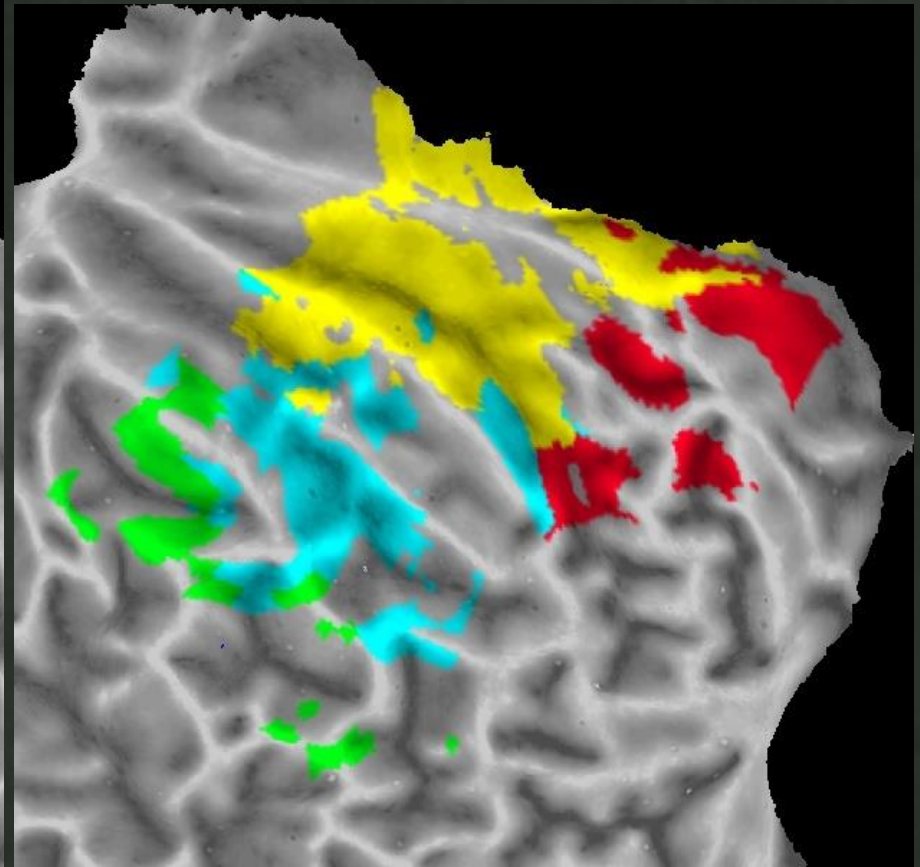
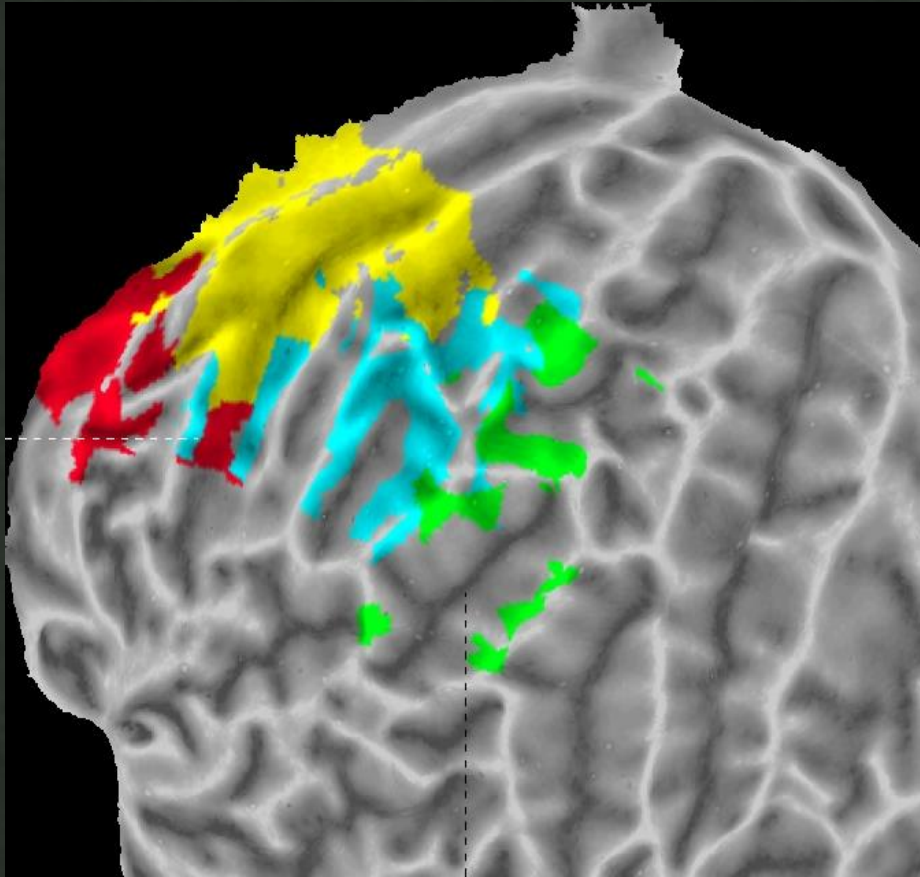
Note: These are called "blocks", but they are in an event-related design



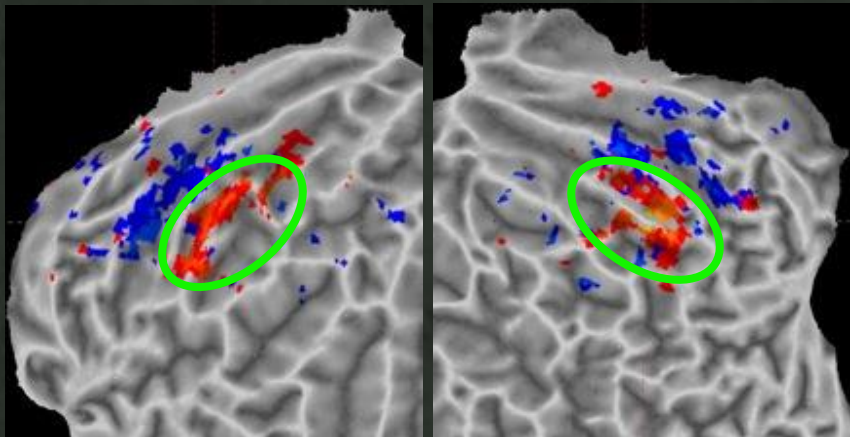
Designs were optimized in *optseq2* and simulations were run to ensure equivalent estimation efficiencies for blocked and random conditions.

Ventral temporal cortex includes:

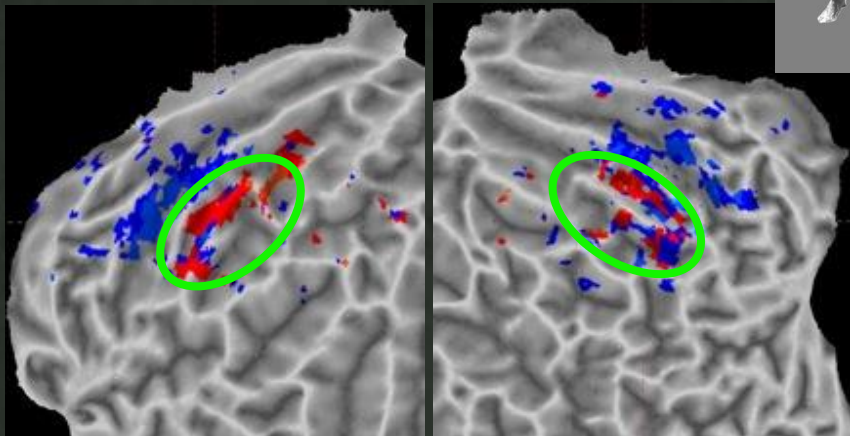
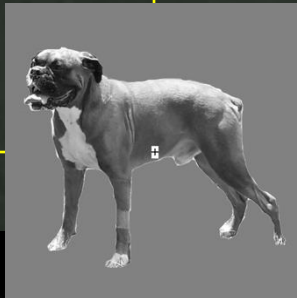
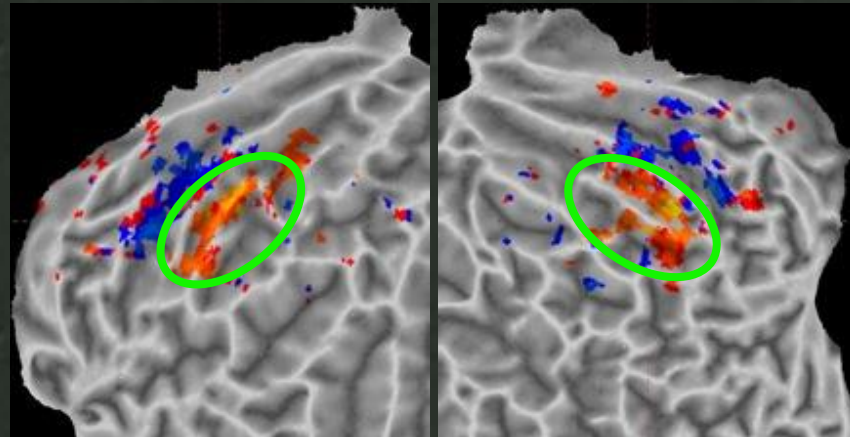
- 1) lingual gyrus
- 2) fusiform gyrus
- 3) parahippocampal gyrus
- 4) inferior temporal gyrus



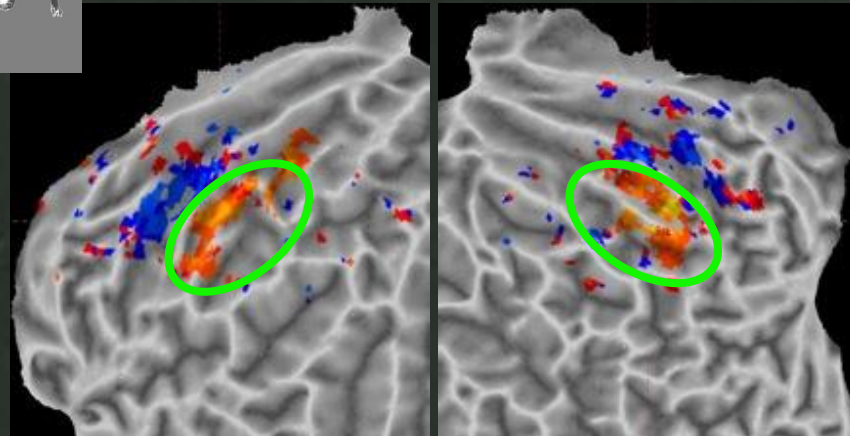
Dog - Block - Odd



Dog - Random - Odd



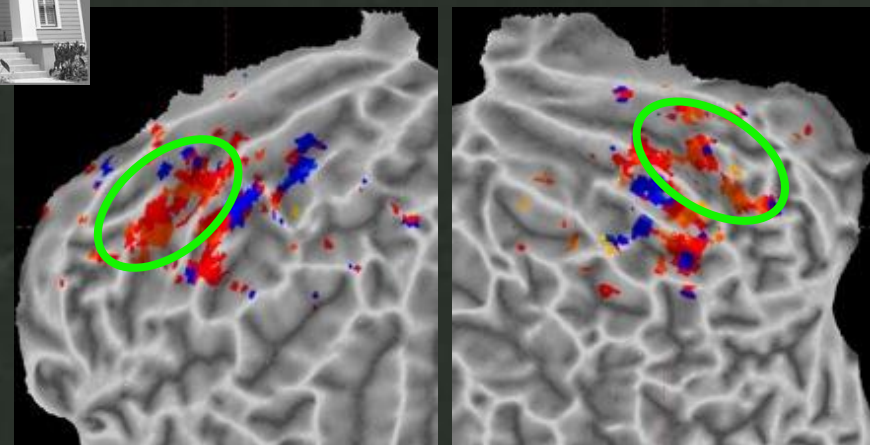
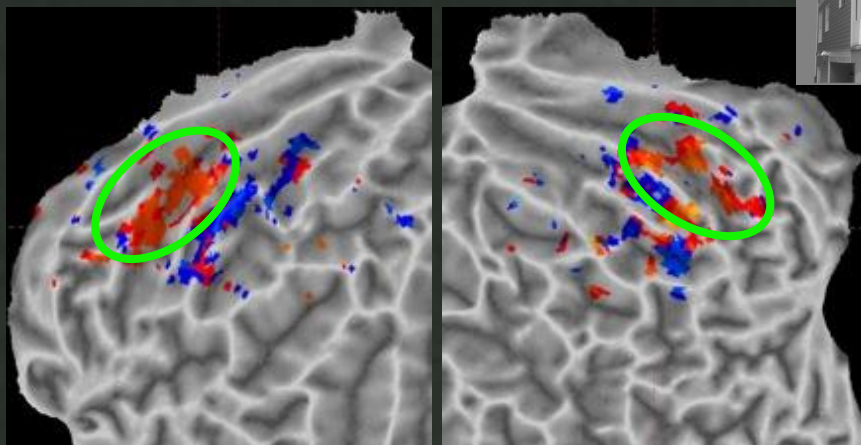
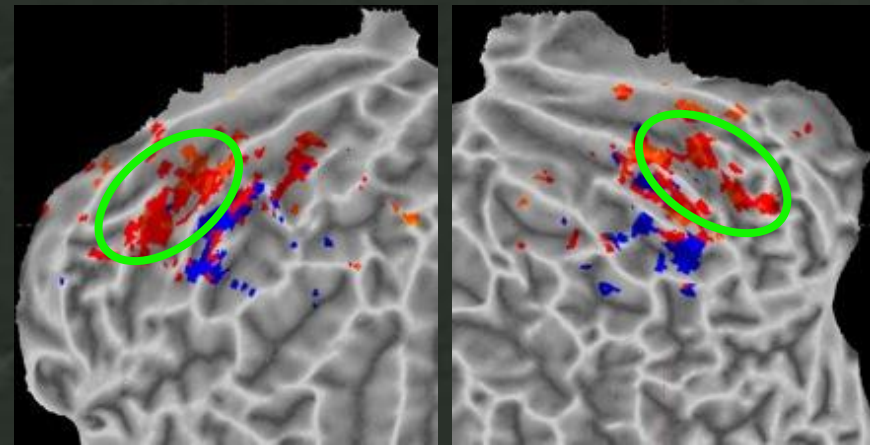
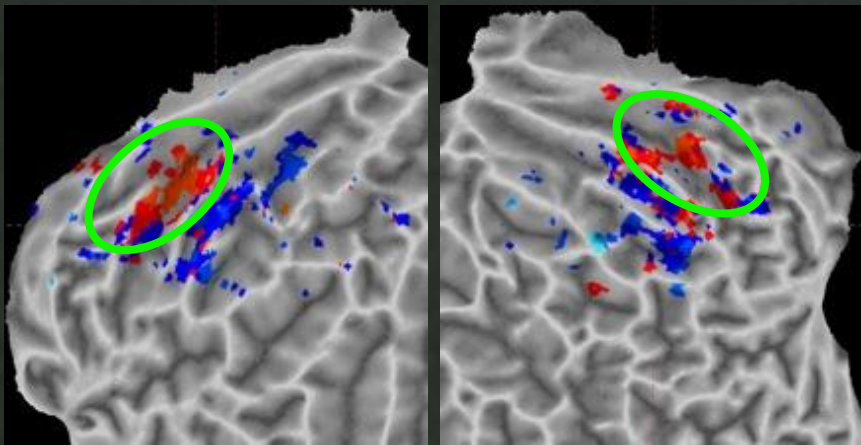
Dog - Block - Even



Dog - Random - Even

House - Block - Odd

House- Random - Odd

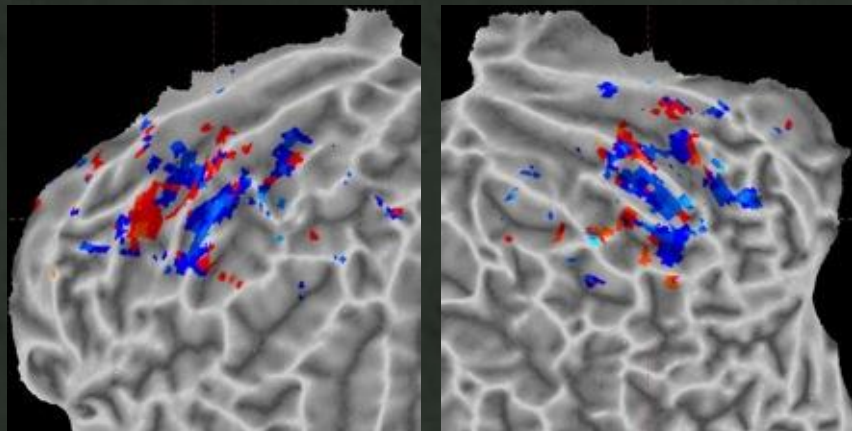


House- Block - Even

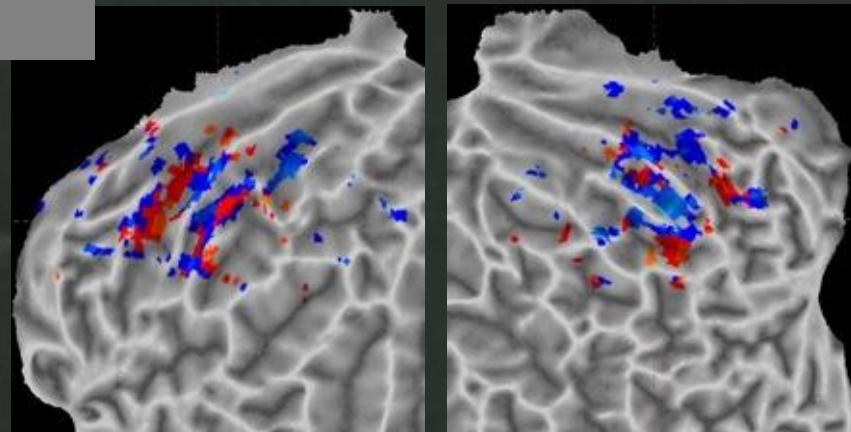
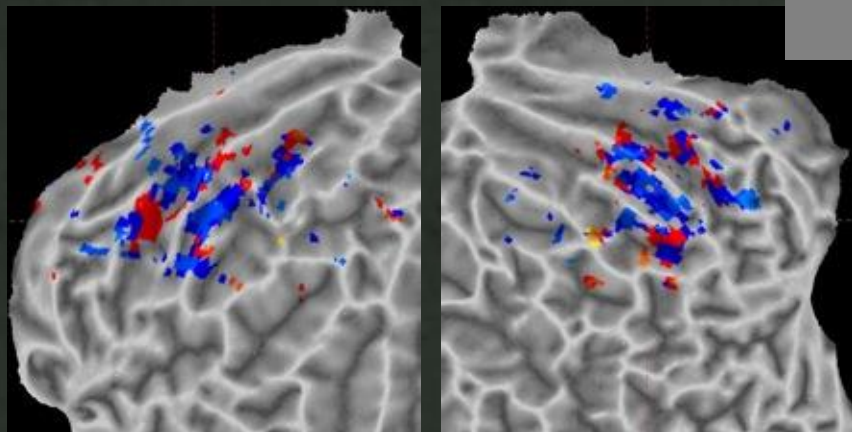
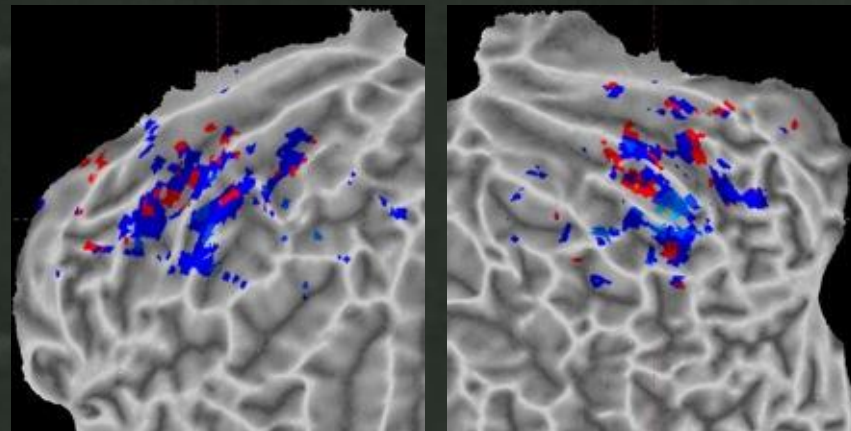
House- Random - Even

Note: These data are from a single subject

Hammer - Block - Odd



Hammer- Random - Odd

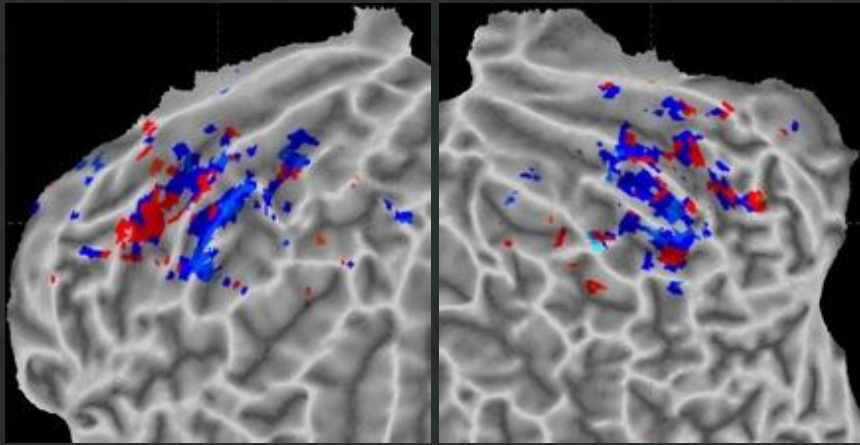


Hammer- Block - Even

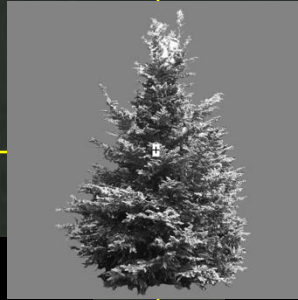
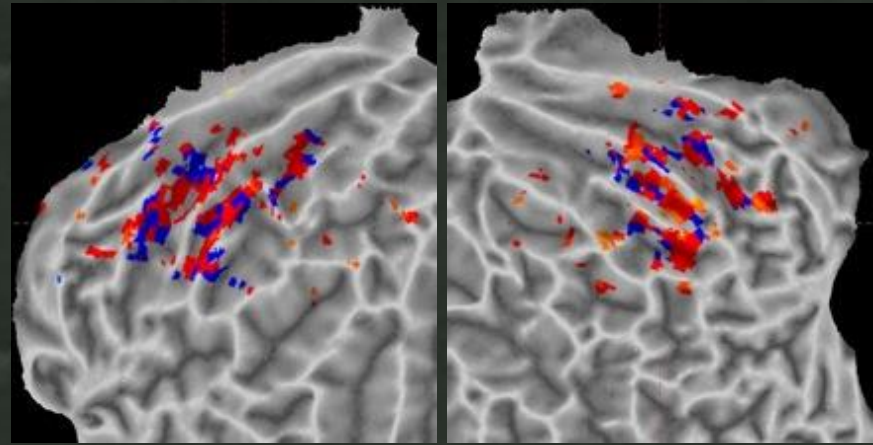
Hammer- Random - Even

Note: These data are from a single subject

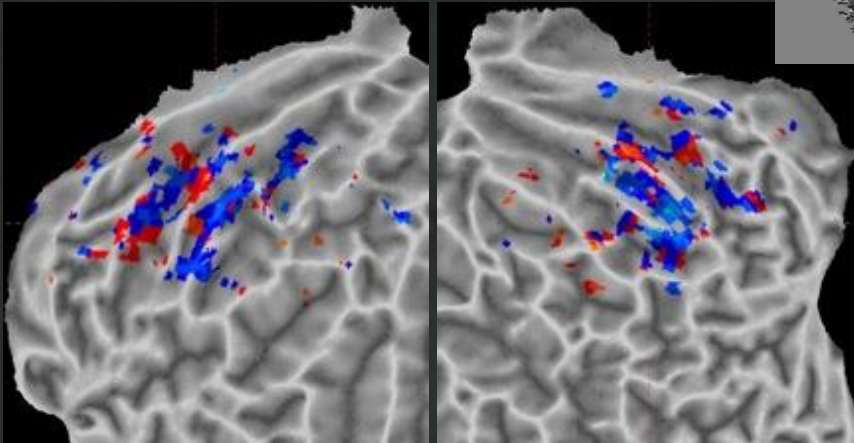
Tree - Block - Odd



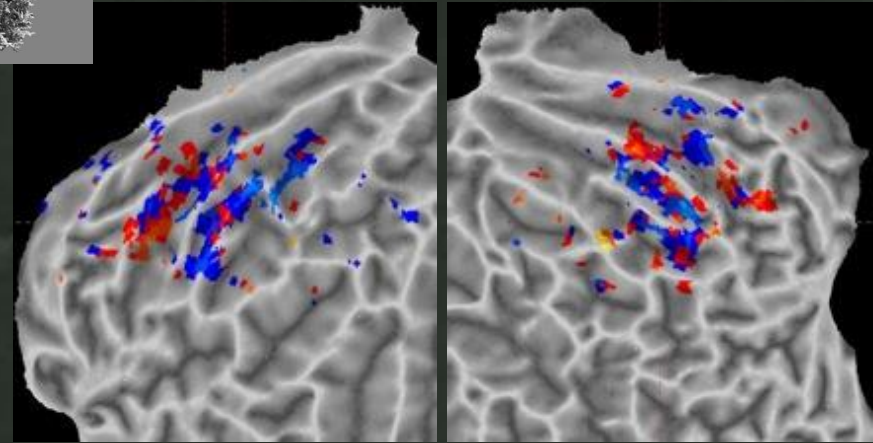
Tree - Random - Odd



Tree - Block - Even

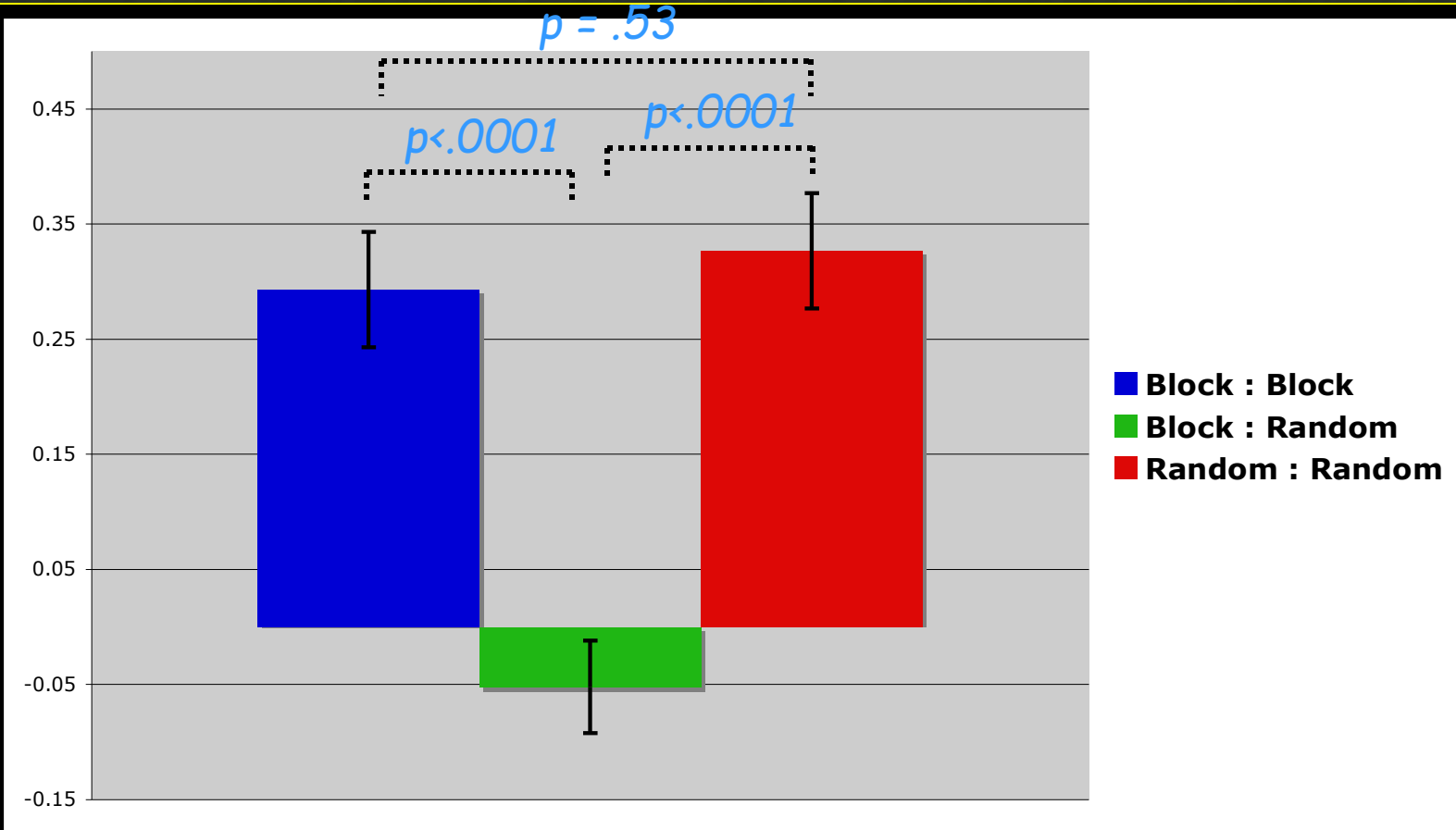


Tree - Random - Even



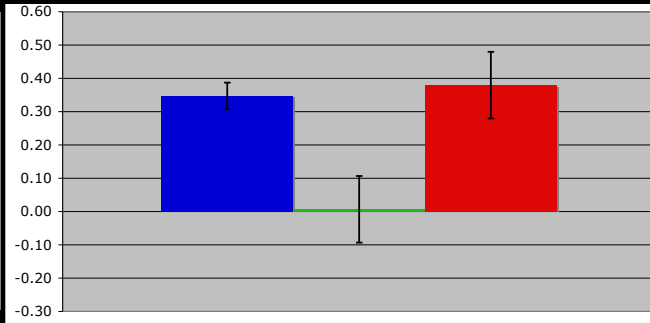
Note: These data are from a single subject

Correlations between versus within contexts

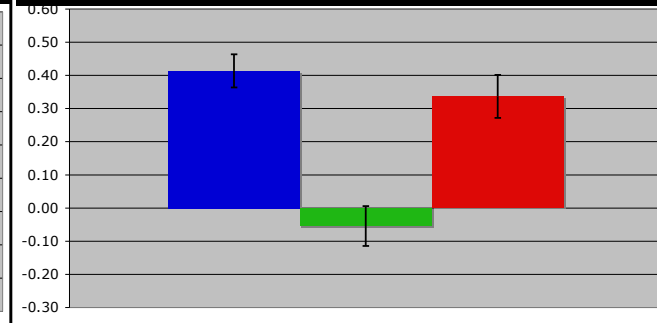


Correlations between versus within contexts for each category

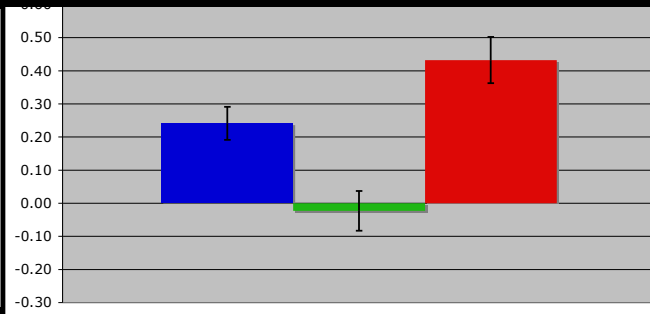
DOG



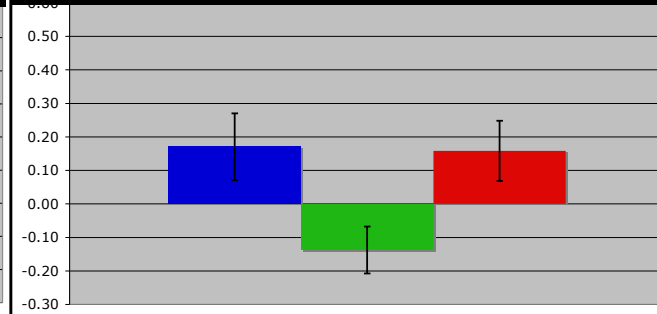
HOUSE



HAMMER



TREE



- Block : Block
- Block : Random
- Random : Random