



UNIVERSITÀ
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CiMeC
Center for Mind/Brain Sciences

Brain Functional MRI Introduction

Louvain-la-Neuve - Neuroimaging Workshop 2019

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CiMeC: <https://www.cimec.unitn.it/>

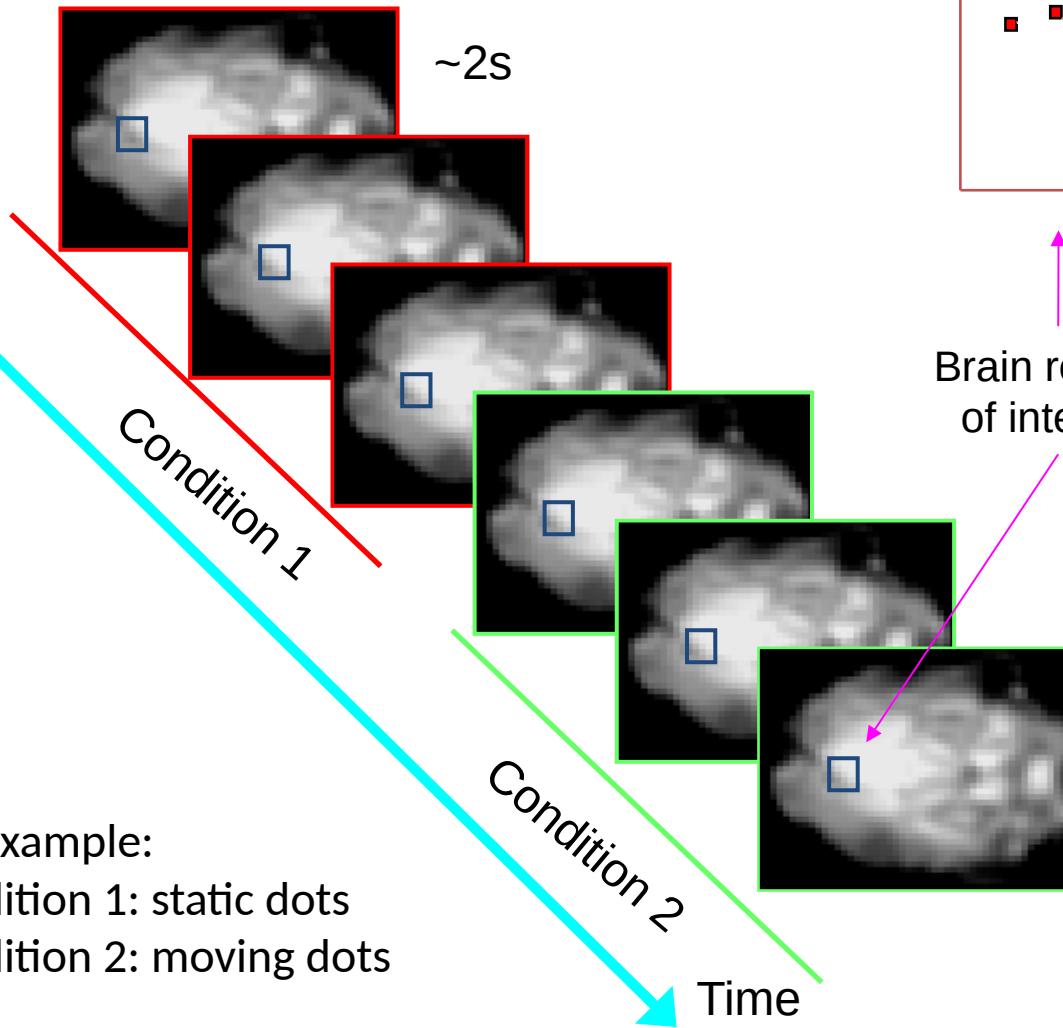
MRI Lab: <http://r.unitn.it/en/cimec/mri>

E-mail: jorge.jovicich@unitn.it



Functional MRI: Why?

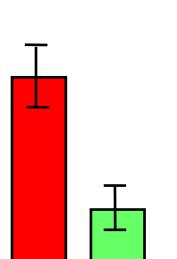
Functional images



fMRI signal changes
In area of interest

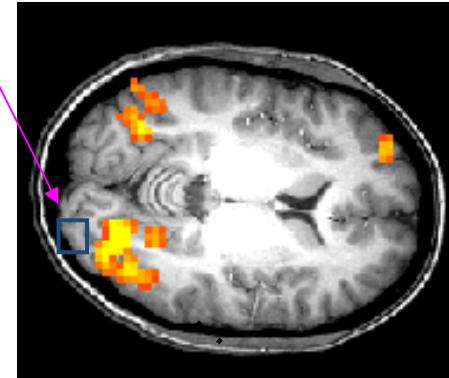


Time



Condition

Statistical Map
superimposed on
anatomical MRI image



~ 5 min

Modified from Jody Culham's fMRI Newbies web site

Lecture 4 outline

Brain functional MRI:

- 
- We want functional contrast:
 - Blood Oxygenation Level Dependent (BOLD)
 - We want to measure signal fluctuations
 - Fast MRI: Echo Planar Imaging
 - We want “clean” data for modeling & analysis
 - Pre-processing

Brain Functional MRI Contrasts

Options:

- **Invasive**
 - Vascular volume (gadolinium)
 - **Non-invasive**
 - Blood Oxygenation Level Dependent (BOLD)
 - Perfusion (CBF: cerebral blood flow)
 - CMRO₂ (Cerebral metabolic rate O₂ consumption)
 - Vascular volume changes (VASO)
 - ... ongoing research (currents, diffusion, etc.)
-
- A blue arrow points from the left towards the 'Non-invasive' section. To the right of the list, there are two blue curly braces. The upper brace groups 'BOLD', 'Perfusion', 'CMRO₂', and 'VASO', with the word 'standard' written in red to its right. The lower brace groups '... ongoing research (currents, diffusion, etc.)', with the word 'research' written in red to its right.

Blood Oxygenation Level Dependent (BOLD) contrast

BOLD contrast is the net result of two separate effects:



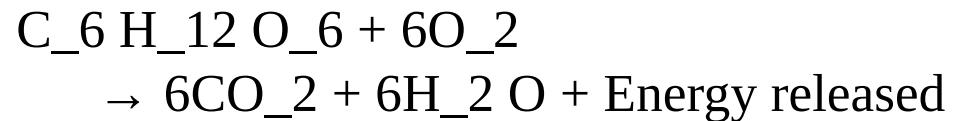
- Hemodynamic response
- Magnetic properties of the hemoglobin molecules

Energy brain metabolism

Neural function relates to oxygen consumption

- **Inhaled air**
 - 78% nitrogen
 - **21% oxygen**
 - 1% inert gases (argon)
 - **0.04% carbon dioxide**
- **Exhaled air**
 - 78% nitrogen
 - **16% oxygen**
 - 1% inert gases (argon)
 - **4% carbon dioxide**
 - **Water vapour**

What happened?



Oxygen oxydized glucose to produce energy

Energy taxi: hemoglobin (Hb)

- Each red blood cell: about 250 million Hb molecules

- Function: transport of ‘goods’ and ‘wastes’

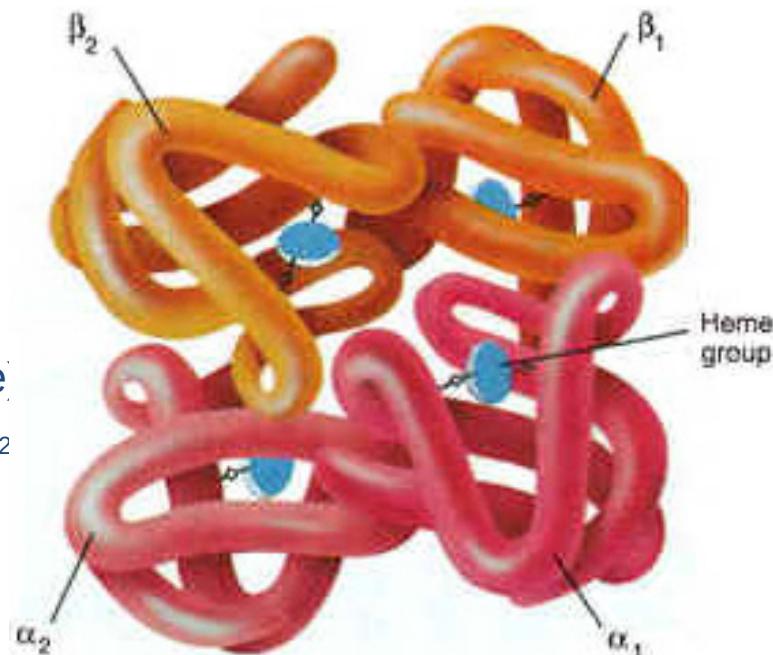
- carries O₂ to tissue and CO₂ away from tissue
 - one Hb molecule can carry up to 4 atoms of O₂

- Hemoglobin molecule structure:

- four protein globin chains
 - each globin chain contains a heme group
 - at center of each heme group is an iron atom (Fe)
 - each heme group can attach an oxygen atom (O₂)

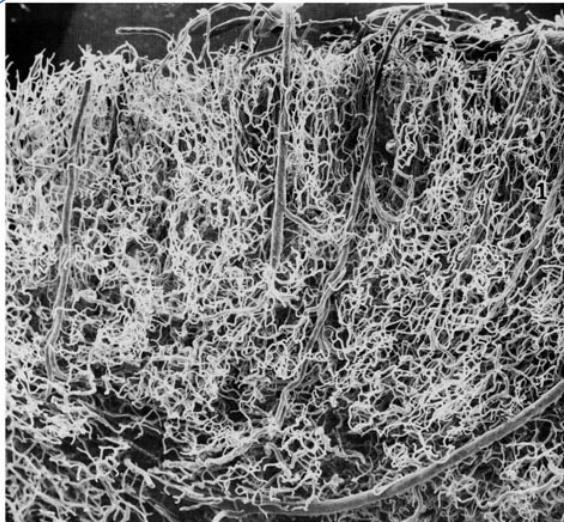
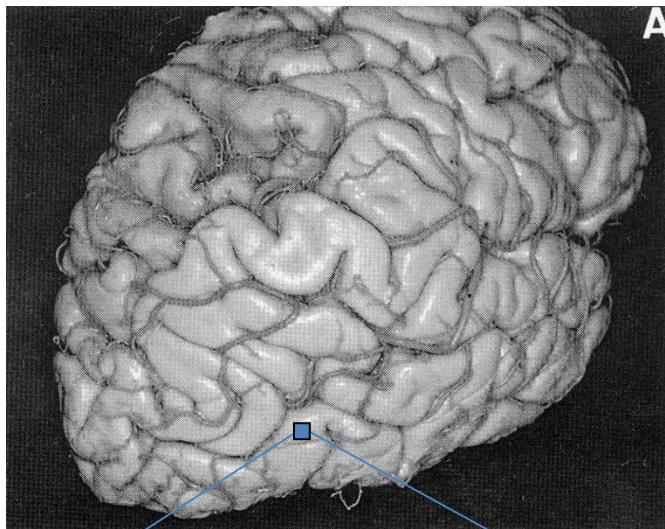
- Hemoglobin molecule states

- Oxy-hemoglobin
 - Deoxy-hemoglobin

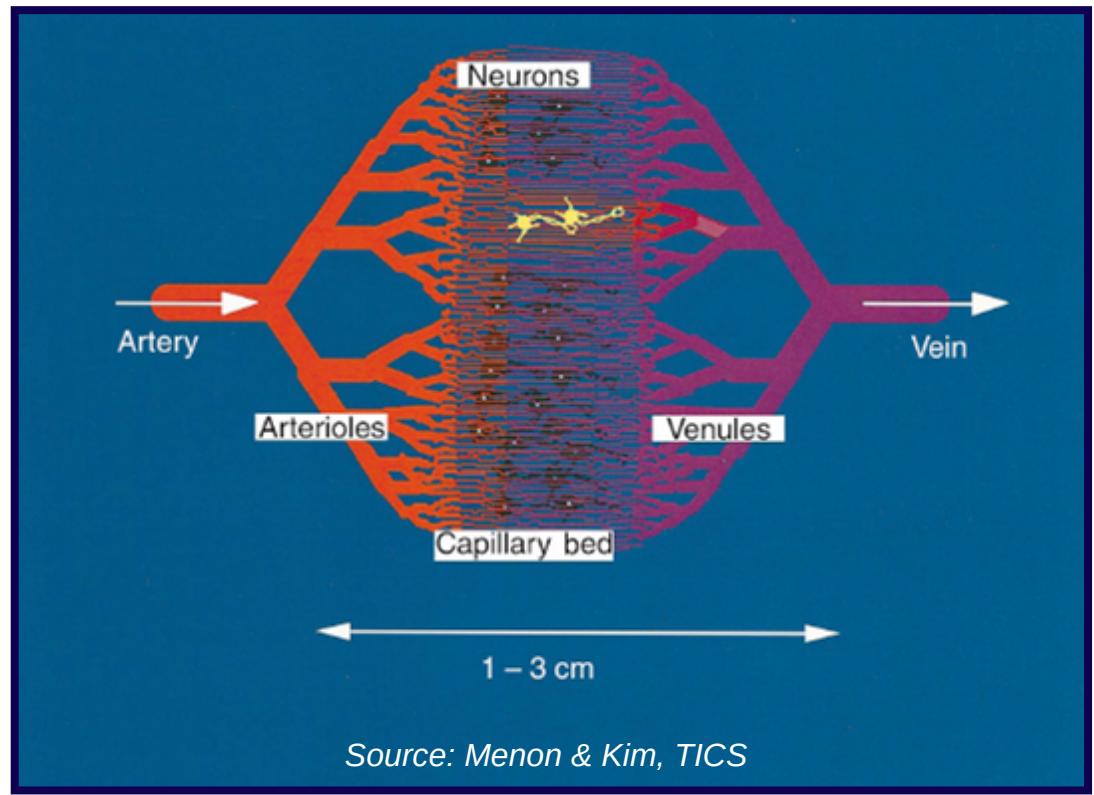


: <http://wsrv.clas.virginia.edu/~rjh9u/hemoglob.html>

Brain vasculature & hemodynamic response

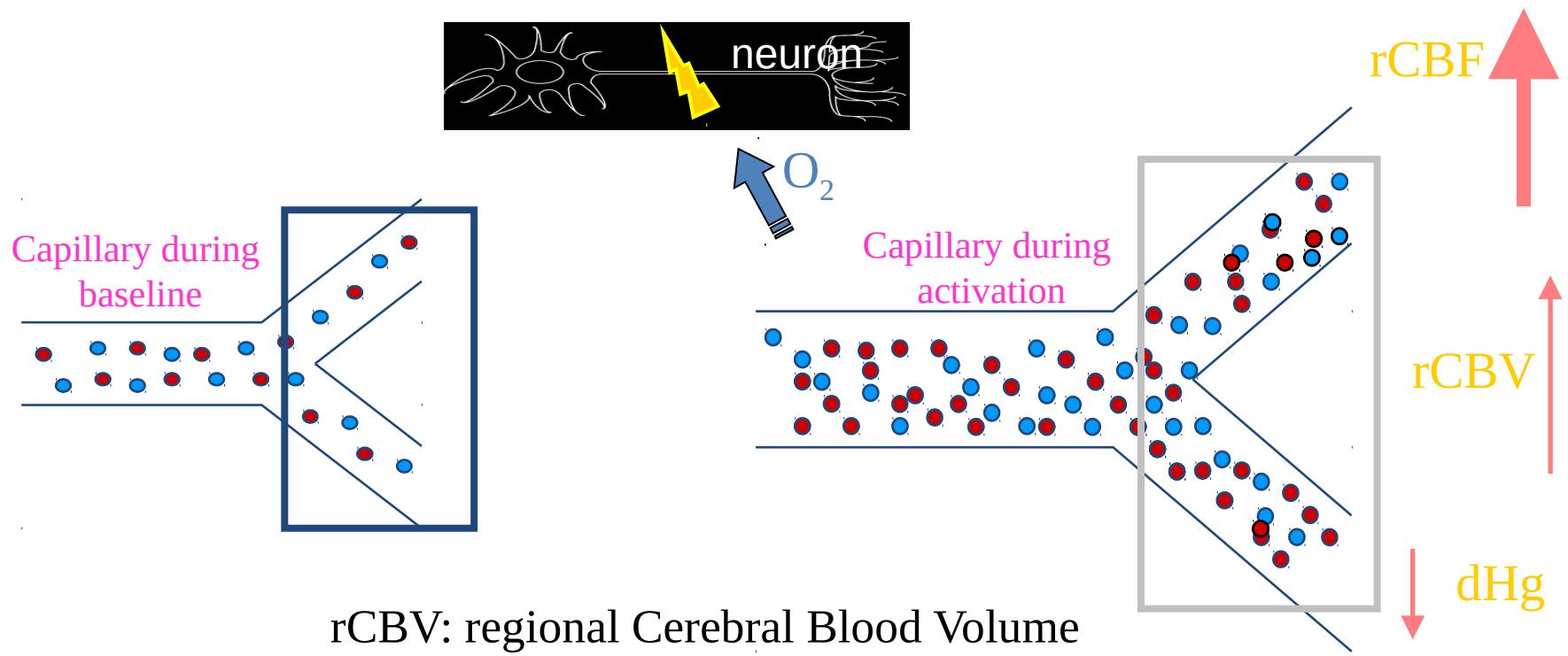


- Brain weight: 2% of body weight
- Brain energy budget: ~20% of body
- Very efficient irrigation system



Source: Menon & Kim, TICS

Brain hemodynamic response



rCBV: regional Cerebral Blood Volume

rCBF: regional Cerebral Blood Flow

dHg: deoxygenated Hemoglobin ●

Hg: oxygenated Hemoglobin ●

Blood Oxygenation Level Dependent (BOLD) contrast

BOLD contrast is the net result of two separate effects:

- Hemodynamic response
 - Concentration of oxygenated hemoglobin changes with neural activation
 - Changes are «local» to brain activation areas
 - There is a quick decrease in oxy-Hg shortly after activation starts
 - After a few seconds a local excess of oxy-Hg in active area is observed

→ Magnetic properties of the hemoglobin molecules

Magnetic properties of hemoglobin (Hb)

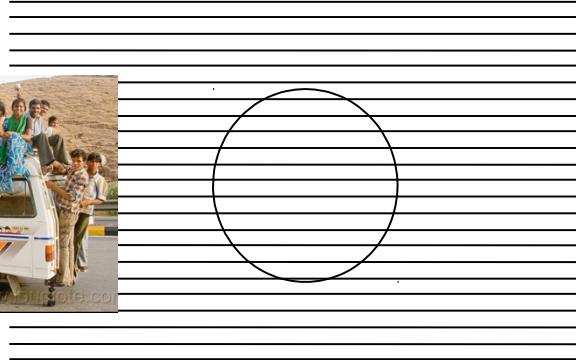
Oxygenation states give rise to different magnetic states

- **Oxygenated-Hb**
 - Isomagnetic with respect to the surrounding tissue, no net magnetization, paired electrons
- **Deoxygenated-Hb**
 - Paramagnetic with respect to the surrounding tissue, net magnetization, unpaired electrons
- Pauling & Coryell, PNAS 1936.

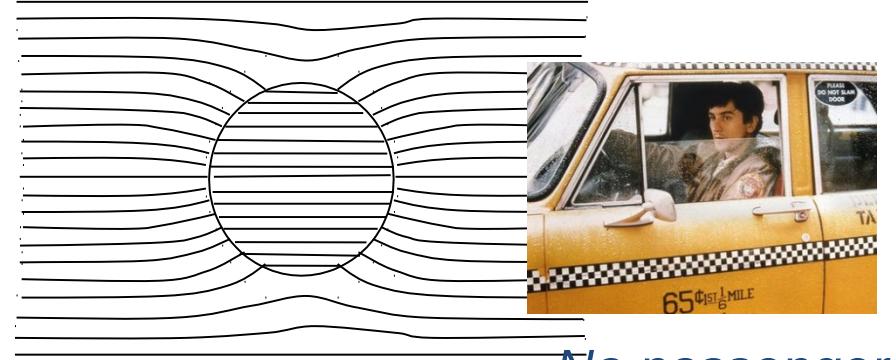
Blood test tube inside an external magnetic field B_0



Full taxi



Oxygenated Hg

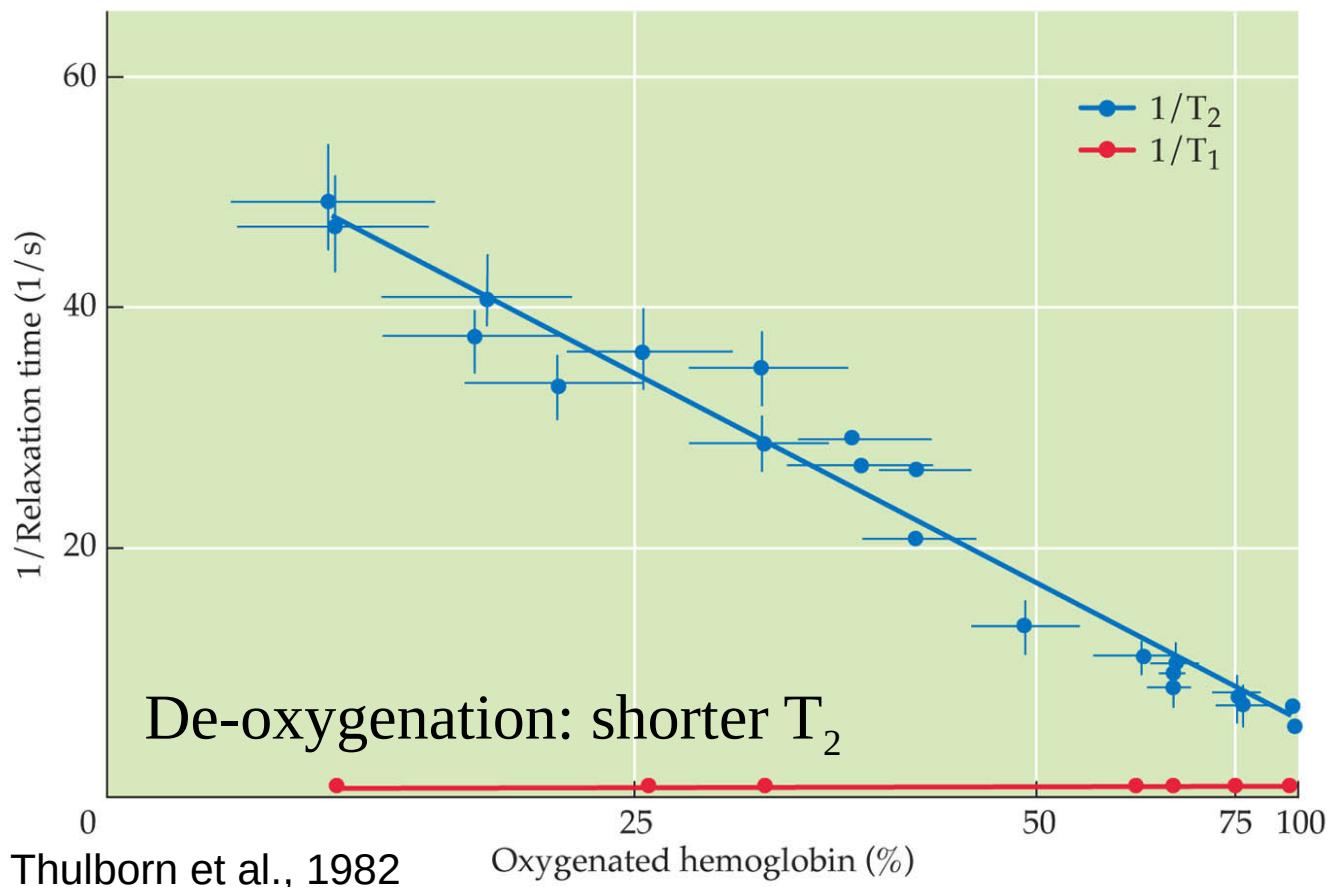


Deoxygenated Hg



No passengers

Hemoglobin oxygenation and the MRI signal



T1: no effects
T2: clear effects

Hemoglobin oxygenation and the MRI signal

Spin Echo
 T_2 changes

Gradient Echo
 T_2^* changes

Oxyhemoglobin

Little difference

Deoxyhemoglobin

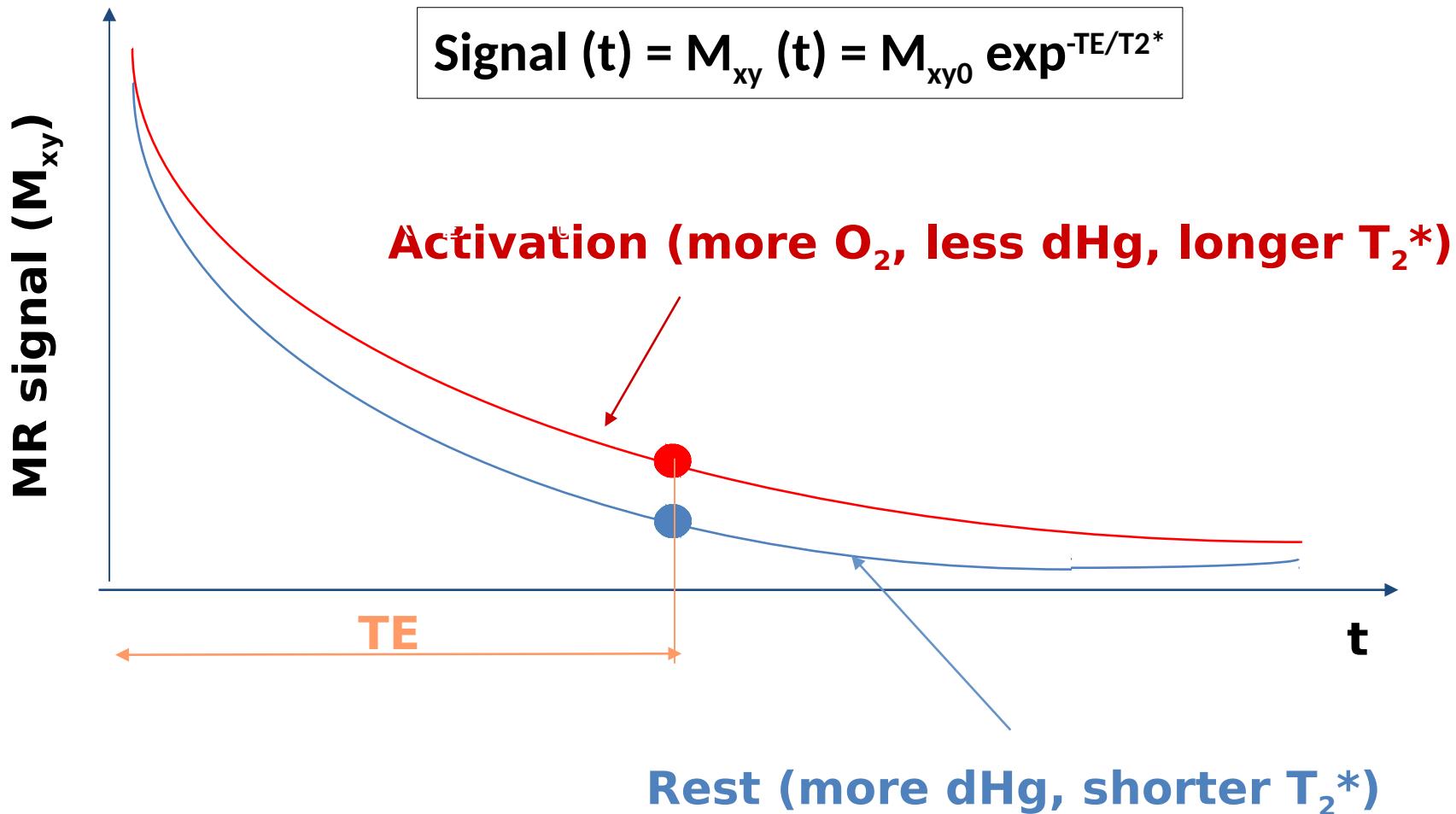
Large difference

Test tubes, Ogawa 1990b

With fast T_2^* -weighted image, we can measure oxygenation changes in blood!

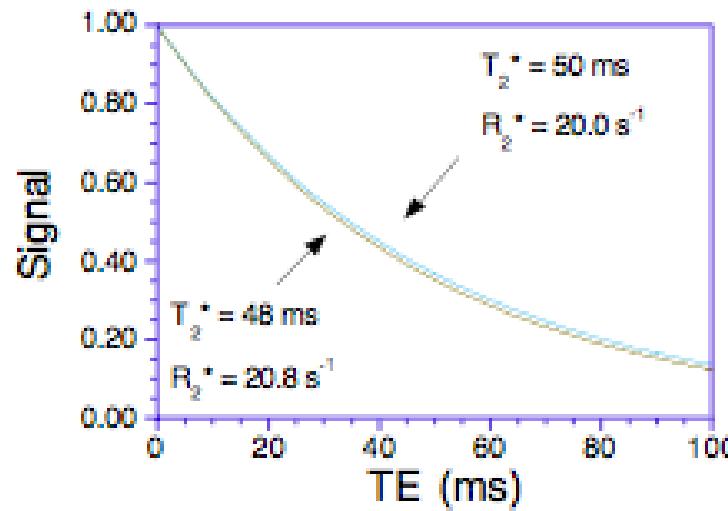
Maybe we can use blood oxygenation changes specific to brain function?

BOLD sensitivity: T_2^* and TE

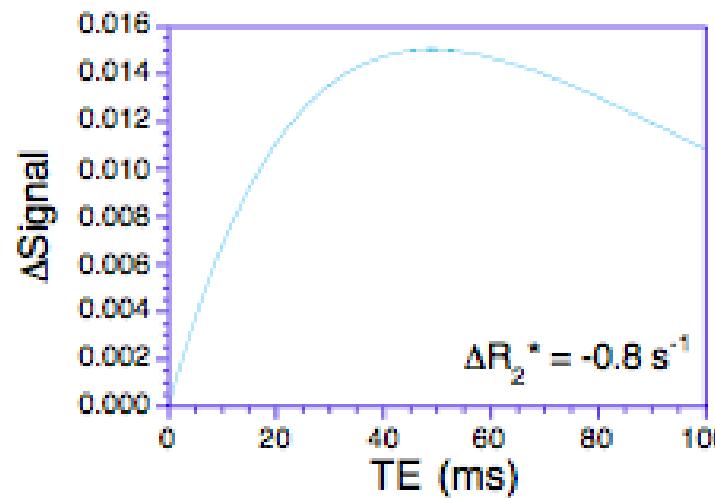


BOLD sensitivity: T_2^* and TE

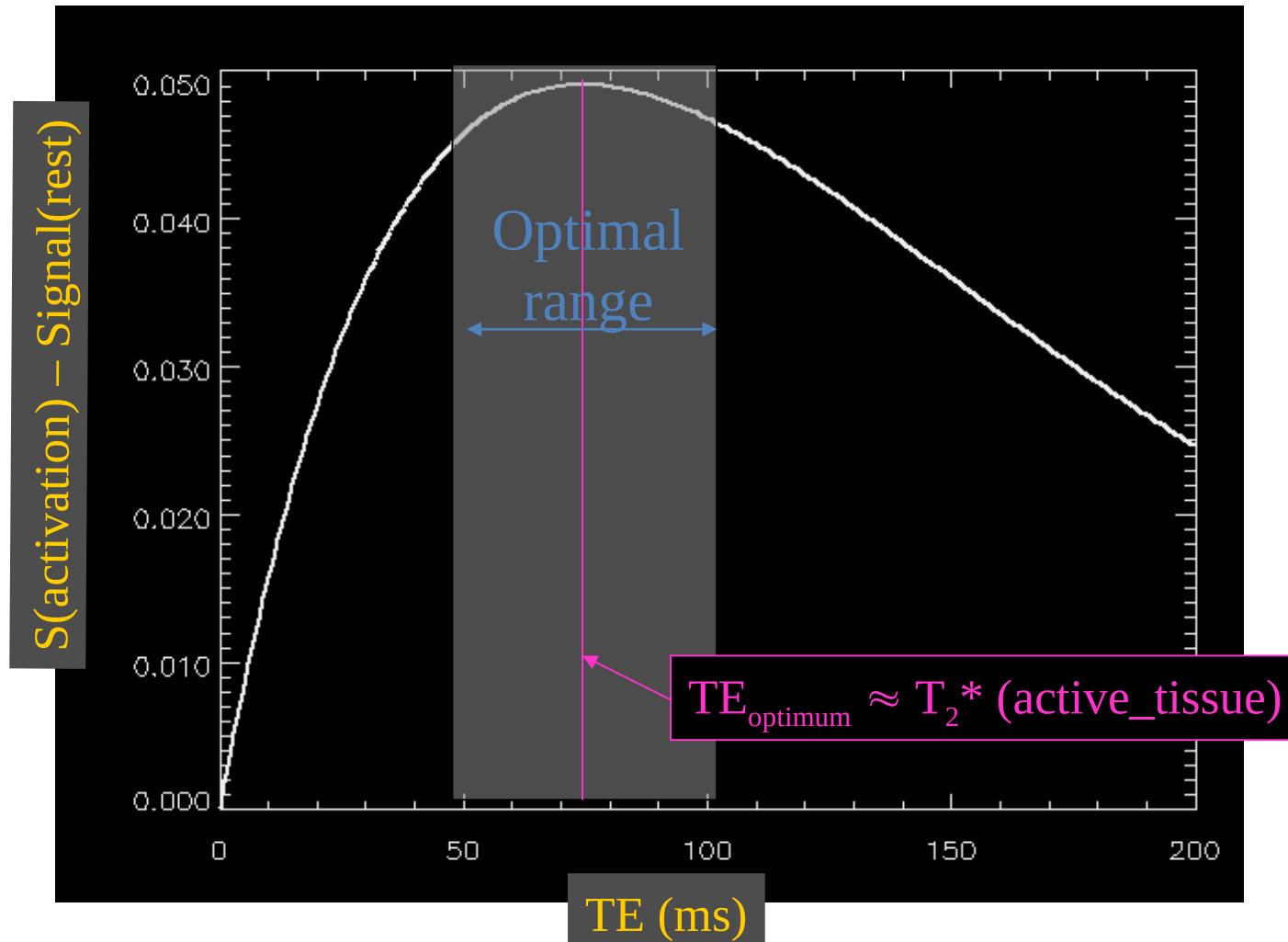
Gray matter T_2^* changes are relatively small between activation states.



The difference in T_2^* shows an optimum TE choice for the maximum sensitivity to detect changes of T_2^*



BOLD sensitivity: T_2^* and TE

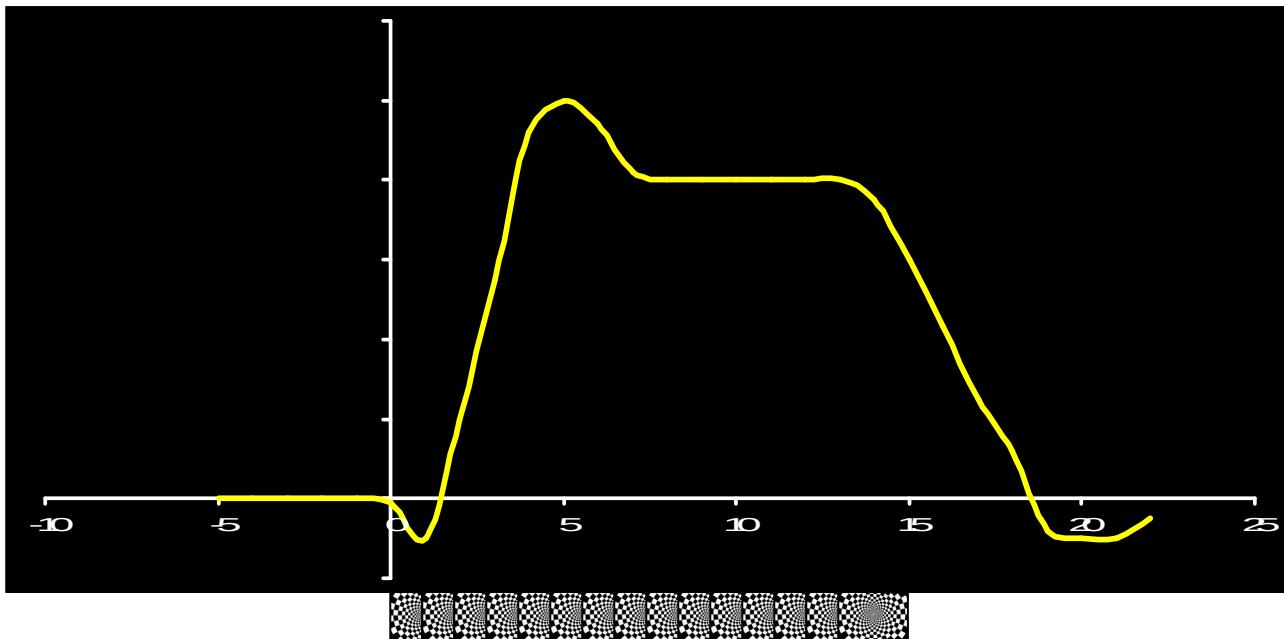


MRI measure of the hemodynamic response



t (seconds after stimulation)

If $[dHb] \uparrow \Rightarrow$ MR signal \downarrow
If $[dHb] \downarrow \Rightarrow$ MR signal \uparrow



BOLD specificity: suboptimal

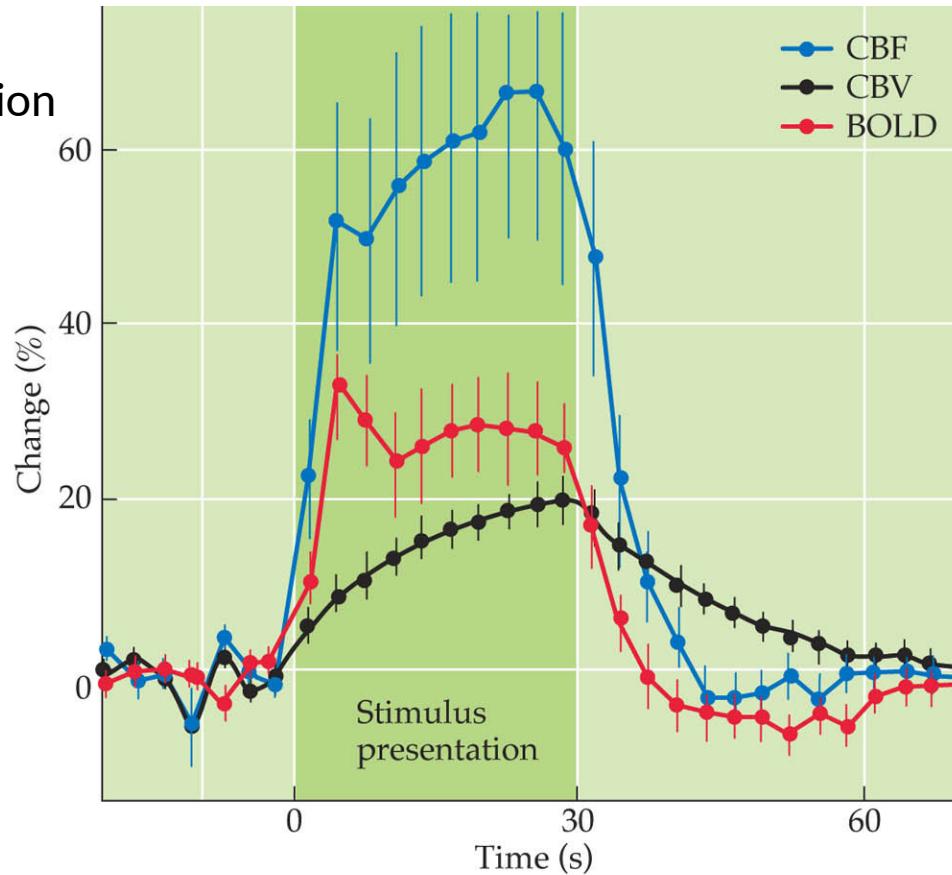
Brain activity responses to whisker stimulation in mice with contrast agent

- deoxy-Hb can change because:
 - Metabolism to support neuronal activation
 - Blood flow changes
 - Blood volume changes
- **BOLD measures the combined effect**

CBF: Cerebral Blood Flow

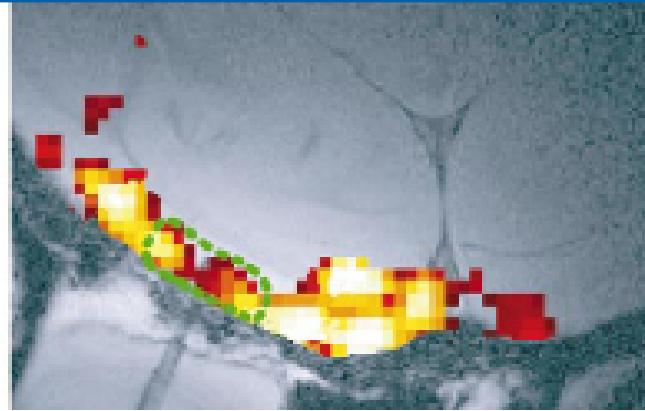
CBV: Cerebral Blood Volume

BOLD: Blood Oxygenation Level Dependent

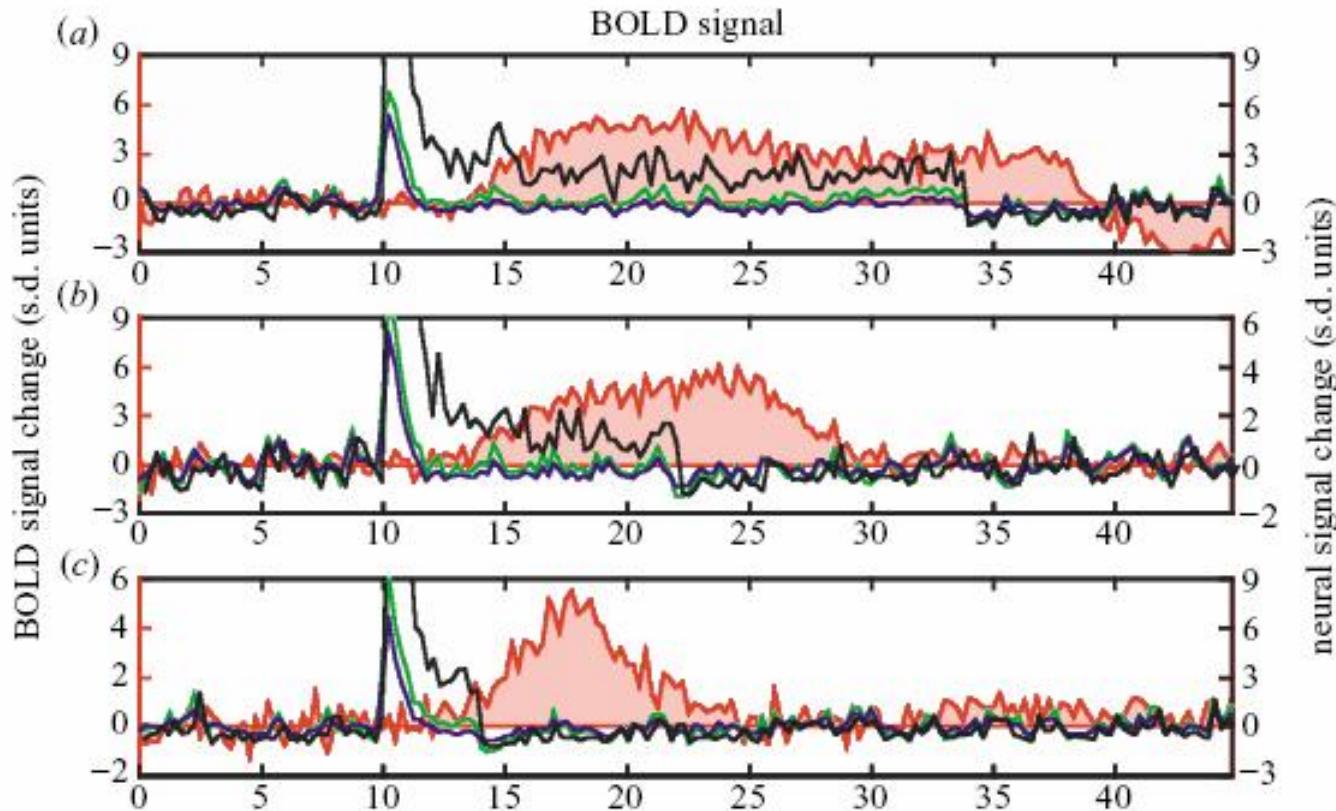


From Huettel, Song and McCarthy

BOLD specificity: there is hope



Evidence that BOLD response reflects pooled local field potential activity (Logothetis 2001)



Lecture 4 outline

Brain functional MRI:

- We want functional contrast:
 - Blood Oxygenation Level Dependent (BOLD)
- We want to measure signal fluctuations
 - Fast MRI: Echo Planar Imaging
- We want “clean” data for modeling & analysis
 - Pre-processing



What sequence would we like for fMRI?

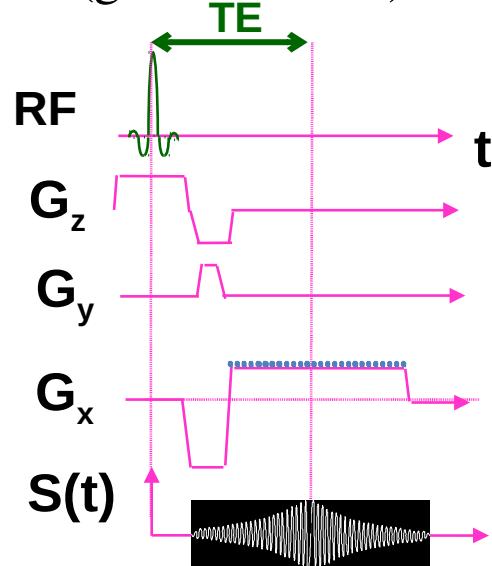
- High Functional sensitivity
 - T_2^* gives the strongest BOLD effects
- High Speed
 - Fast acquisition to follow signal dynamics
- High Spatial resolution
 - To understand anatomical location of activity
- High Functional specificity
 - To correctly interpret signal fluctuations

Echo Planar Imaging (EPI)

- EPI: standard imaging sequence for fast MRI
(brain fMRI, diffusion, perfusion, etc.)
- EPI advantages for brain fMRI
 - Nowadays easily available
 - Dominant contrast is T_2^* (BOLD)
 - Spin-echo EPI can have T_2 & T_2^*
 - Typically allows full brain coverage in $\sim 1\text{sec}$ (or less!) with 2 mm isotropic voxels (or less!)
- EPI limitations:
 - High sensitivity to local magnetic field inhomogeneities
 - Signal loss and image distortions
 - Gradient switching: Nyquist ghost
 - Loud
 - Signal decay during acquisition limits spatial resolution

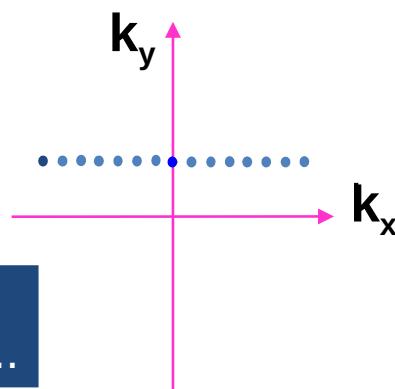
Structural versus EPI MRI

Conventional MRI (gradient-echo)



"slice select"

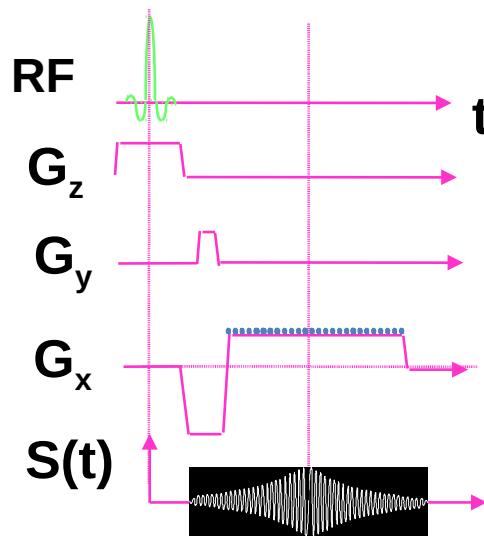
"freq. enc"
(read-out)



one RF excitation,
one line of kspace...

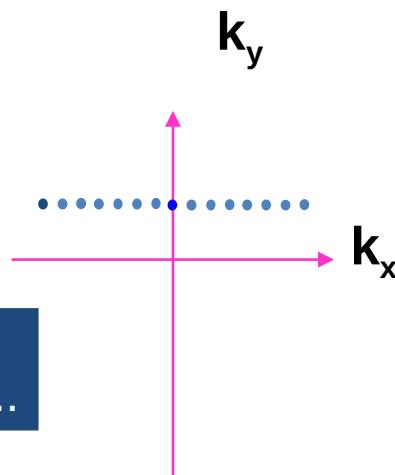
What sequence would we like for fMRI?

Conventional MRI (gradient-echo)



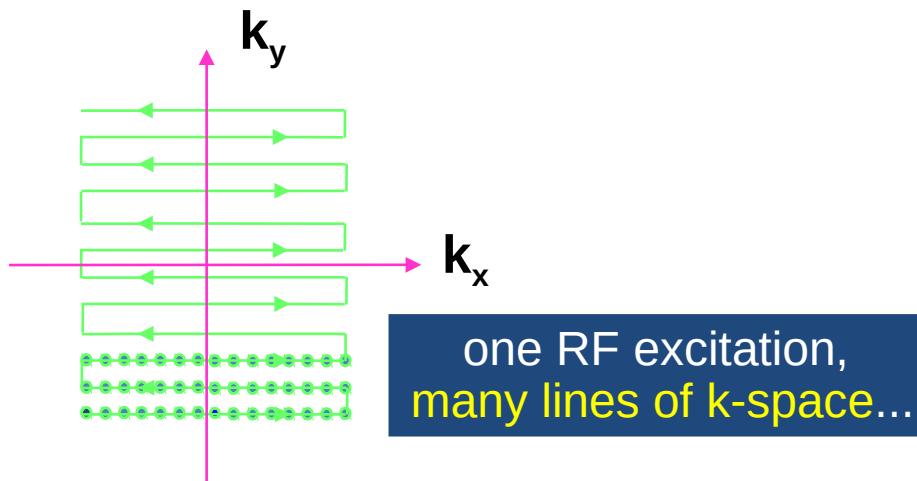
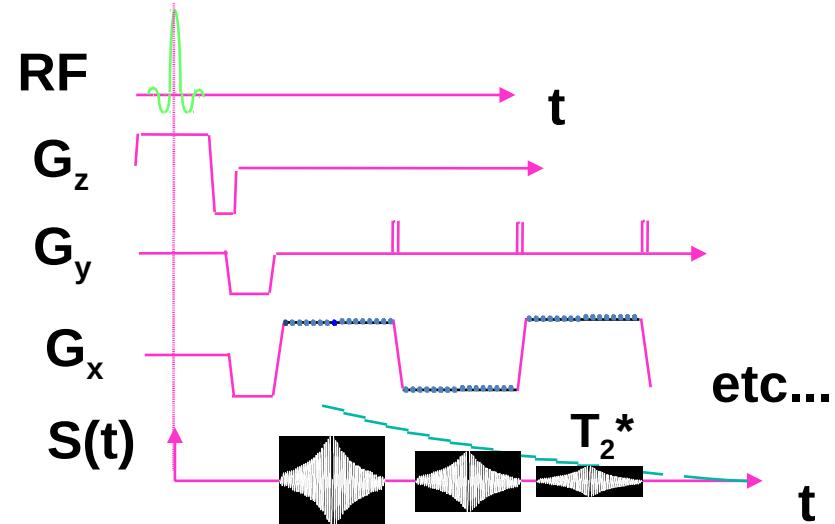
“slice select”

“freq. enc”
(read-out)



one RF excitation,
one line of kspace...

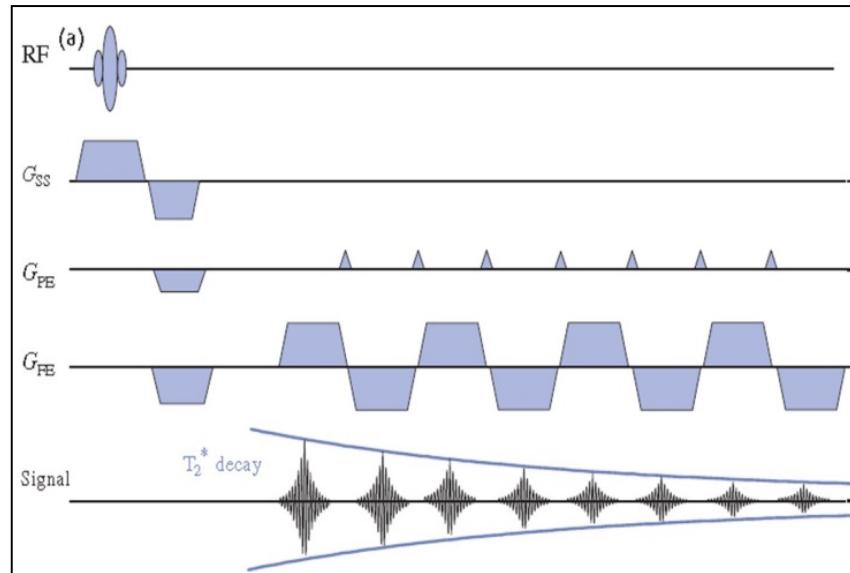
Echo-planar imaging (gradient-echo)



one RF excitation,
many lines of k-space...

Standard EPI

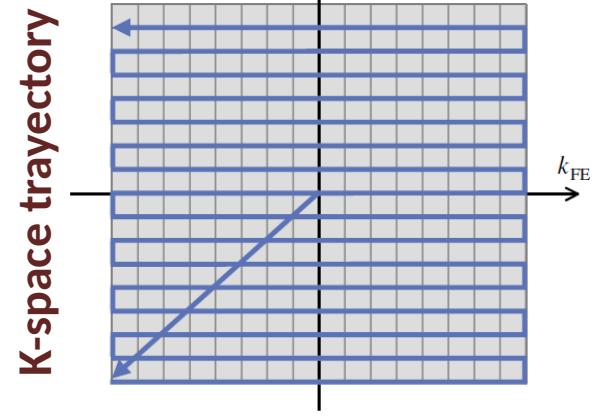
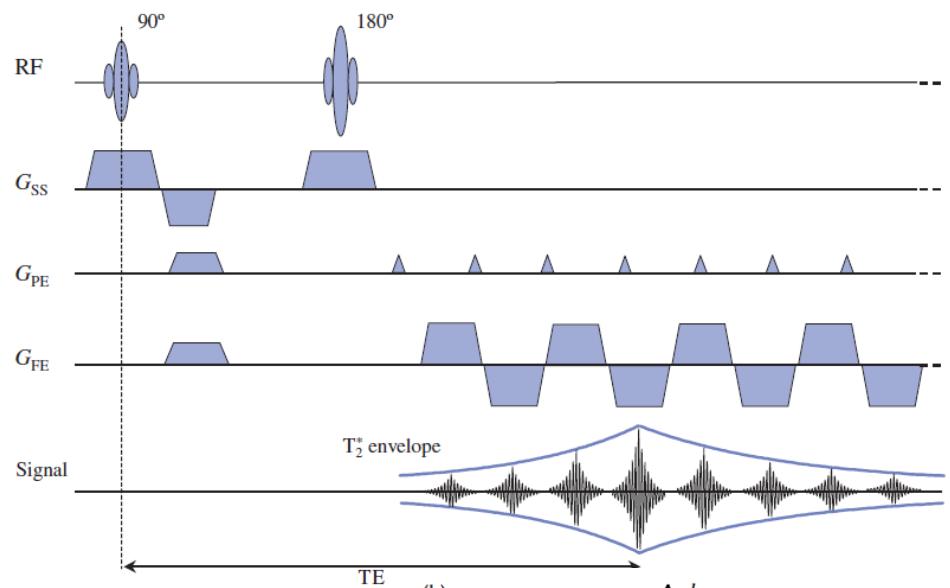
Gradient-echo EPI (T_2^*)



$$S_{(TE)} = S_0 e^{-TE/T_2^*}$$

$$\frac{1}{T_2^*} = \frac{1}{T_2} + \gamma \frac{\Delta B}{2}$$

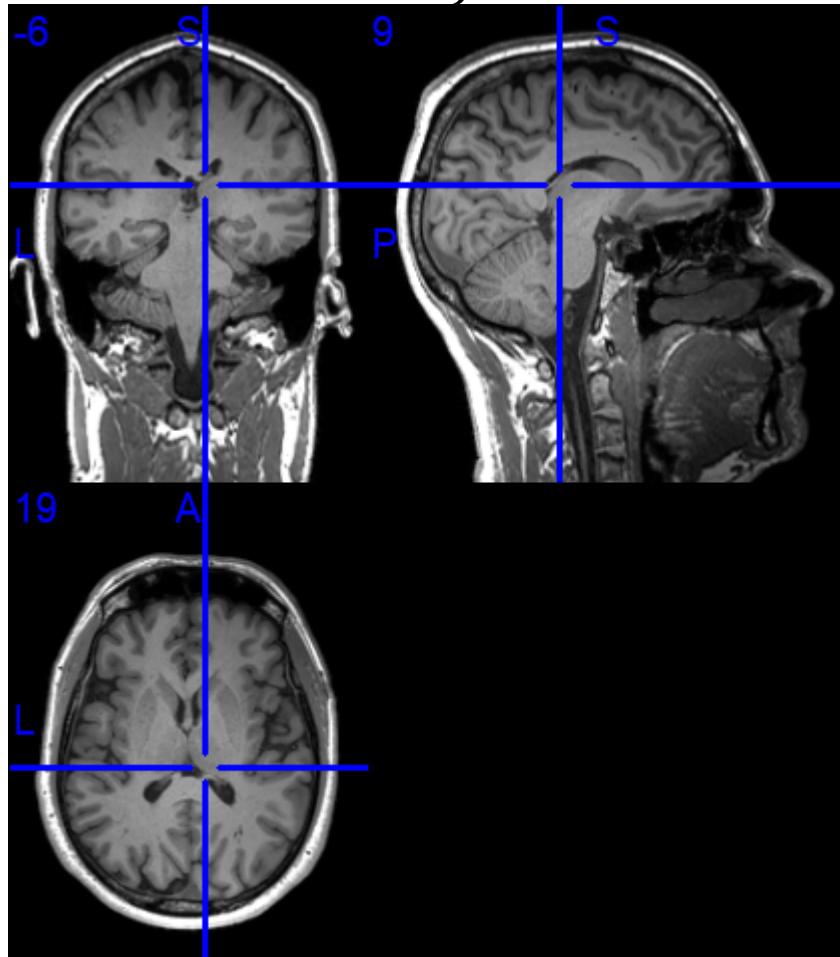
Spin-echo EPI (T_2 and T_2^*)



Example

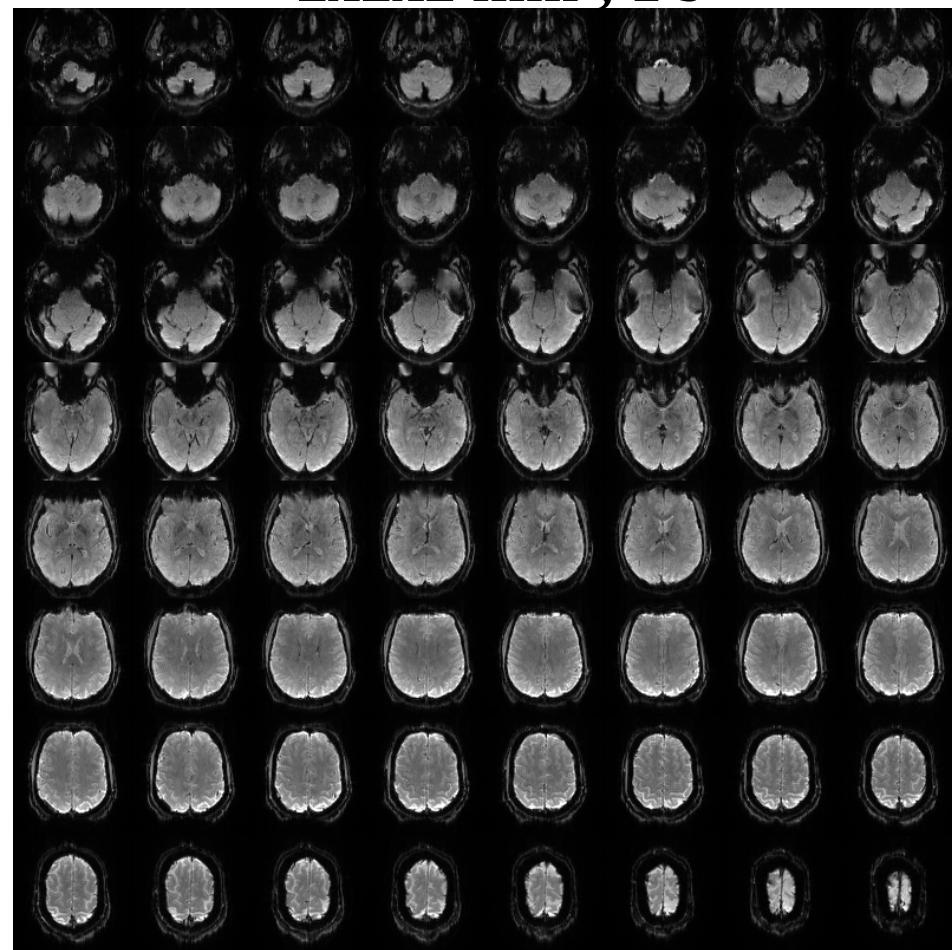
Structural MRI (T1-weighted)

1x1x1 mm³, 328 s



Functional MRI (T2*-weighted)

2x2x2 mm³, 1 s



3T Prisma Siemens, 64 head/neck channel coil

Lecture 4 outline

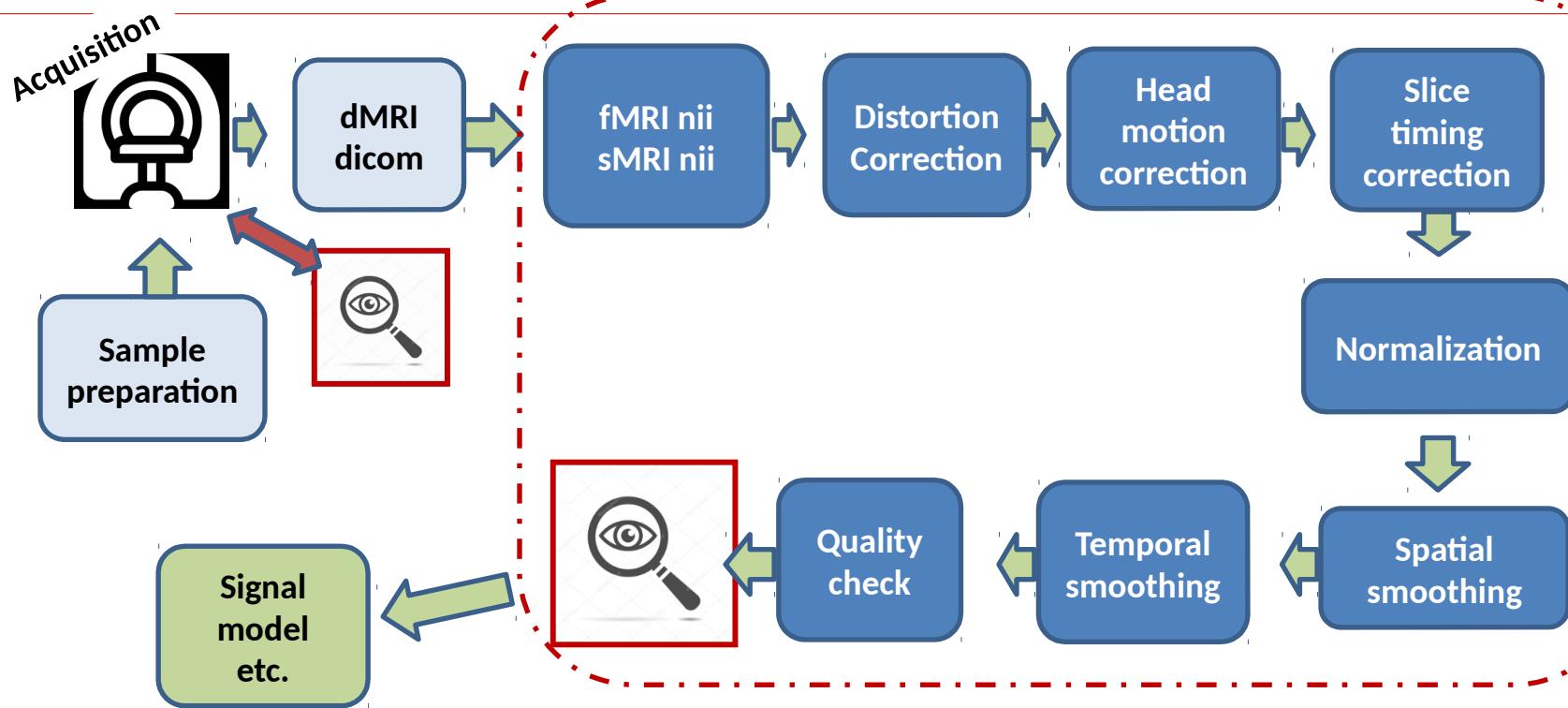
Brain functional MRI:

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fMRI MRI pre-processing

Pre-processing: analyses steps to minimize noise, artifacts to get the «cleanest» data for models



This is a generic example
Jury out for optimal details

Various pre-processing tools available:

<https://www.fil.ion.ucl.ac.uk/spm/>

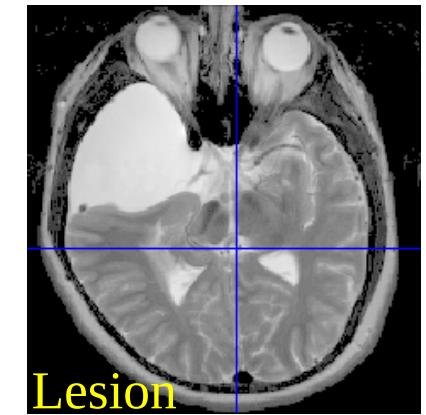
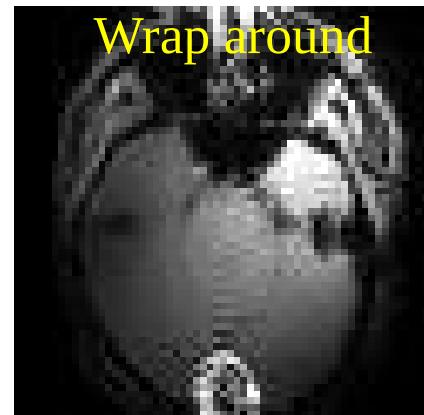
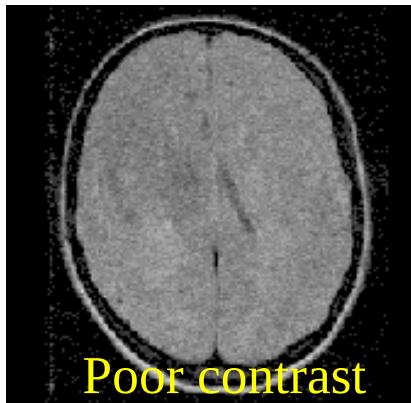
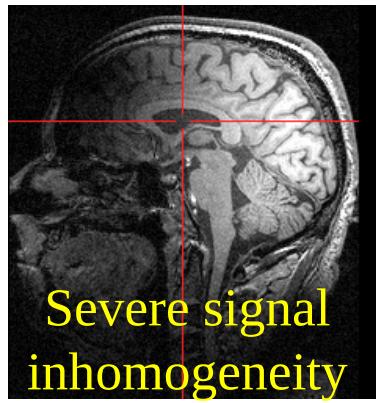
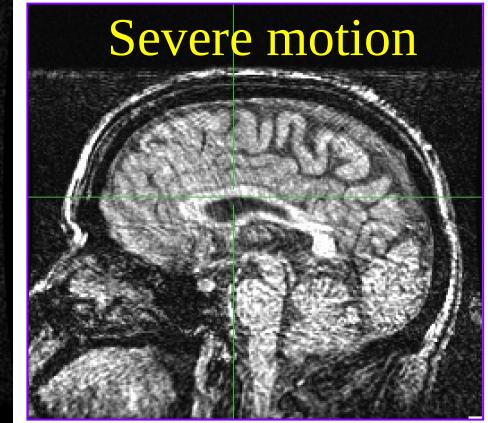
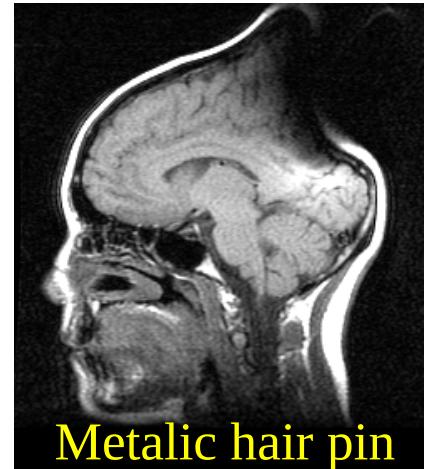
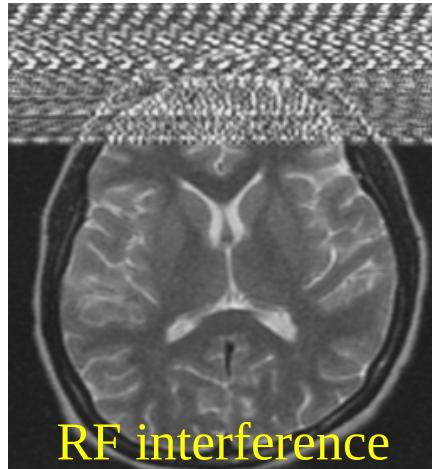
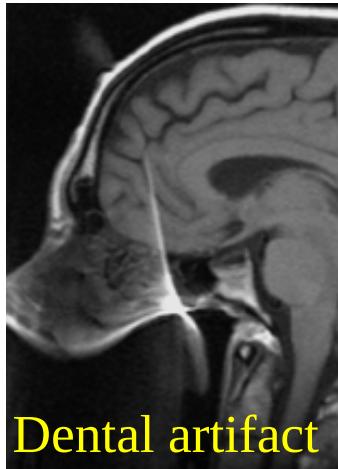
<https://fsl.fmrib.ox.ac.uk/fsl>

<https://afni.nimh.nih.gov/>

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LOOK at the data DURING the experiment

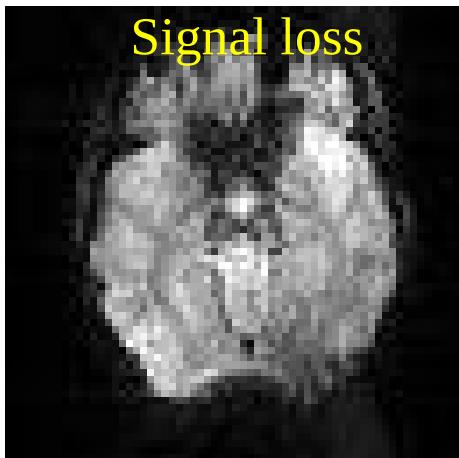
Look for problems, for example:



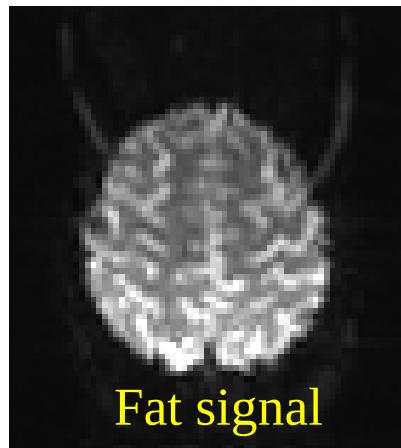
LOOK at the data DURING the experiment

And look for problems, for example:

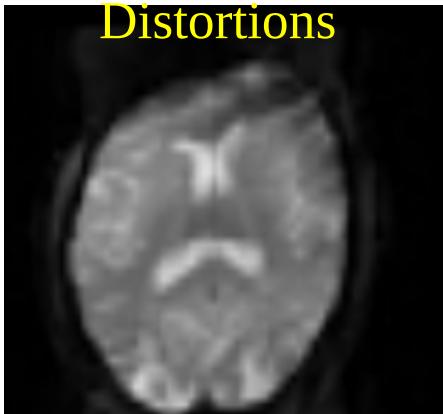
Signal loss



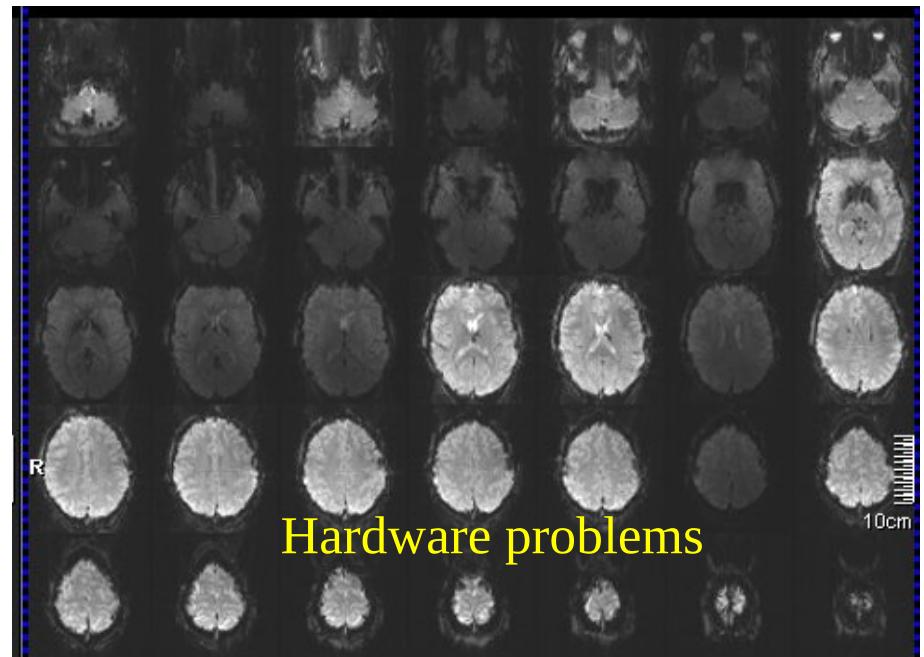
Fat signal



Distortions

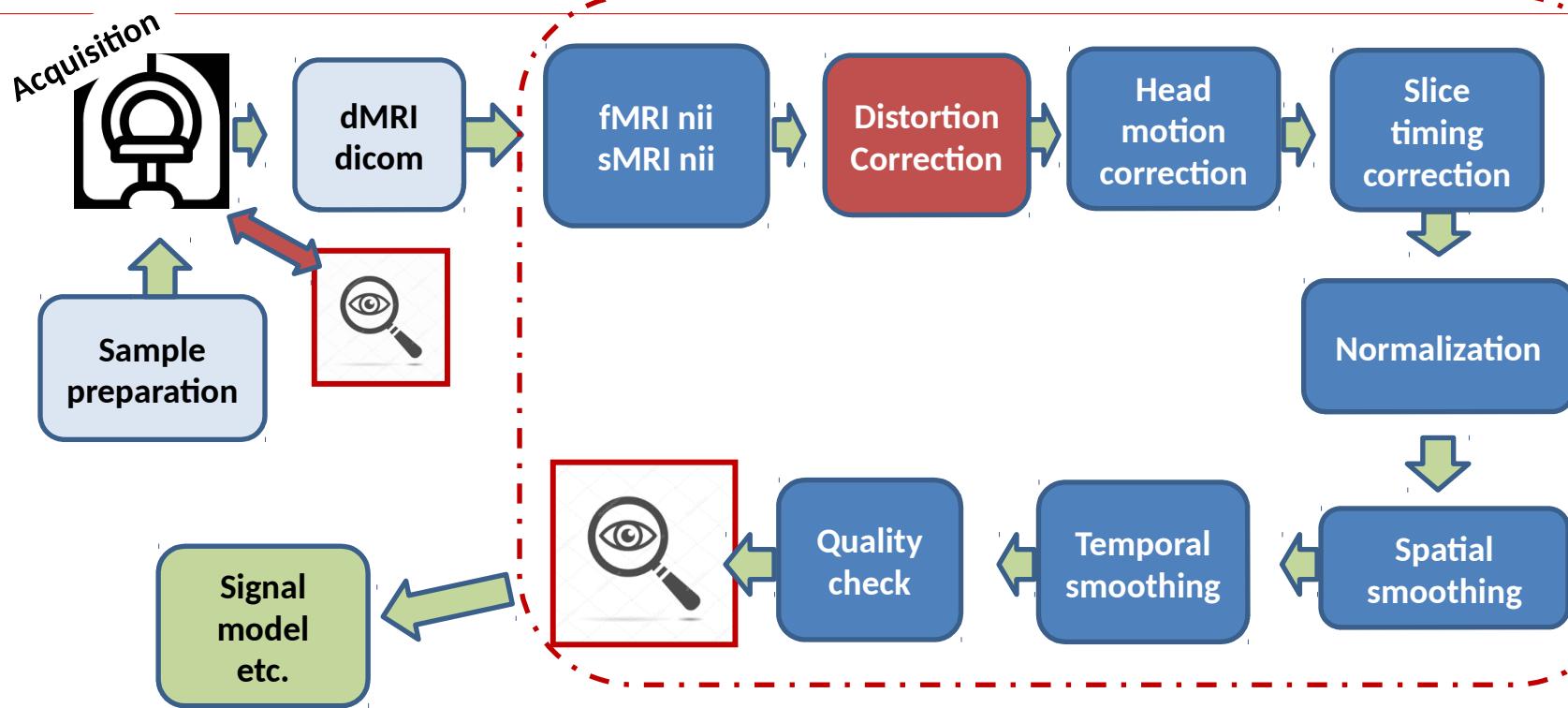


Hardware problems



fMRI MRI pre-processing

Pre-processing: analyses steps to minimize noise, artifacts to get the «cleanest» data for models



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Jury out for optimal details

Various pre-processing tools available:

<https://www.fil.ion.ucl.ac.uk/spm/>

<https://fsl.fmrib.ox.ac.uk/fsl>

<https://afni.nimh.nih.gov/>

...

Geometric distortions in EPI

- The problem:

- Image reconstruction assumes uniform B_0 in the sample
- In reality this is not true: $B(\bar{r}) = B_0 + \Delta B(\bar{r})$
- As a result, EPI shows:
 - areas with signal loss (where $T2^* << TE$): nothing to do!
 - areas with geometric distortions: something to do!

$$\Delta x = \gamma \cdot \Delta B(\bar{r}) \cdot FOVx \cdot \Delta tx$$

$$\Delta y = \gamma \cdot \Delta B(\bar{r}) \cdot FOVy \cdot \Delta ty$$

Voxel shifts relative to
true voxel location.

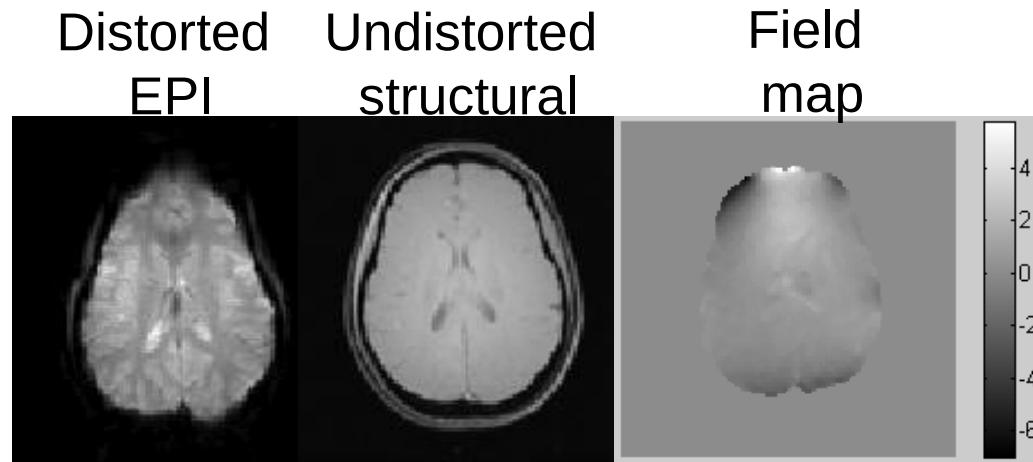
So:
If ΔB is measured
we can shift back voxel

$\Delta x, \Delta y$: amounts of shift (misplacement) in x, y directions in mm

$FOVx, FOVy$: field of view in x, y direction in mm

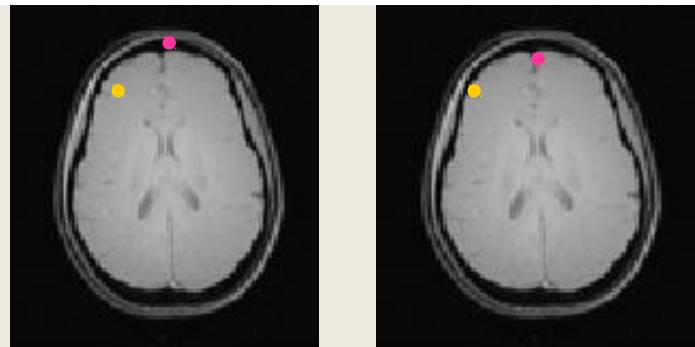
$\Delta tx, \Delta ty$: sampling interval in x, y direction ($\propto 1/\text{sampling rate}$)

Geometric distortions in EPI



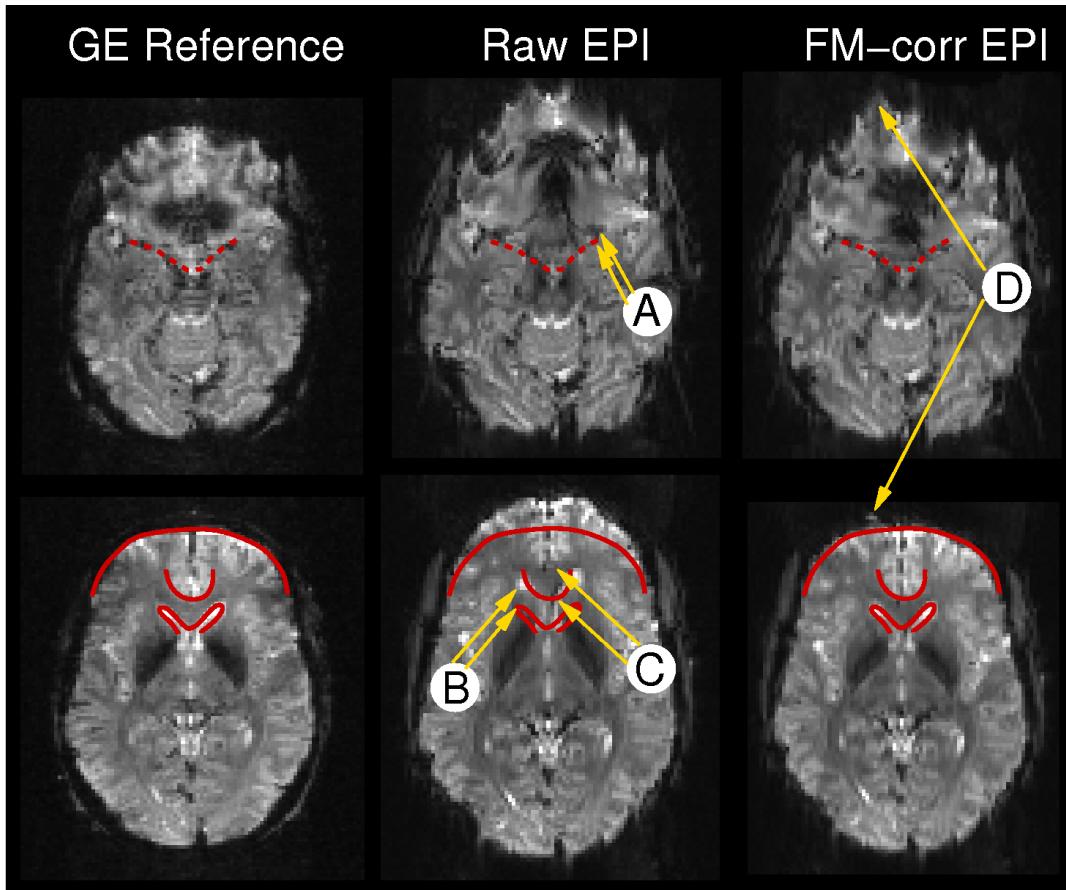
- **Significance**

- Misregistration of EPI and Anatomical image
 - ⇒ Incorrect mapping of region of interest(ROI)
 - ⇒ Need to be corrected using **Fieldmap**



EPI geometric distortions and correction

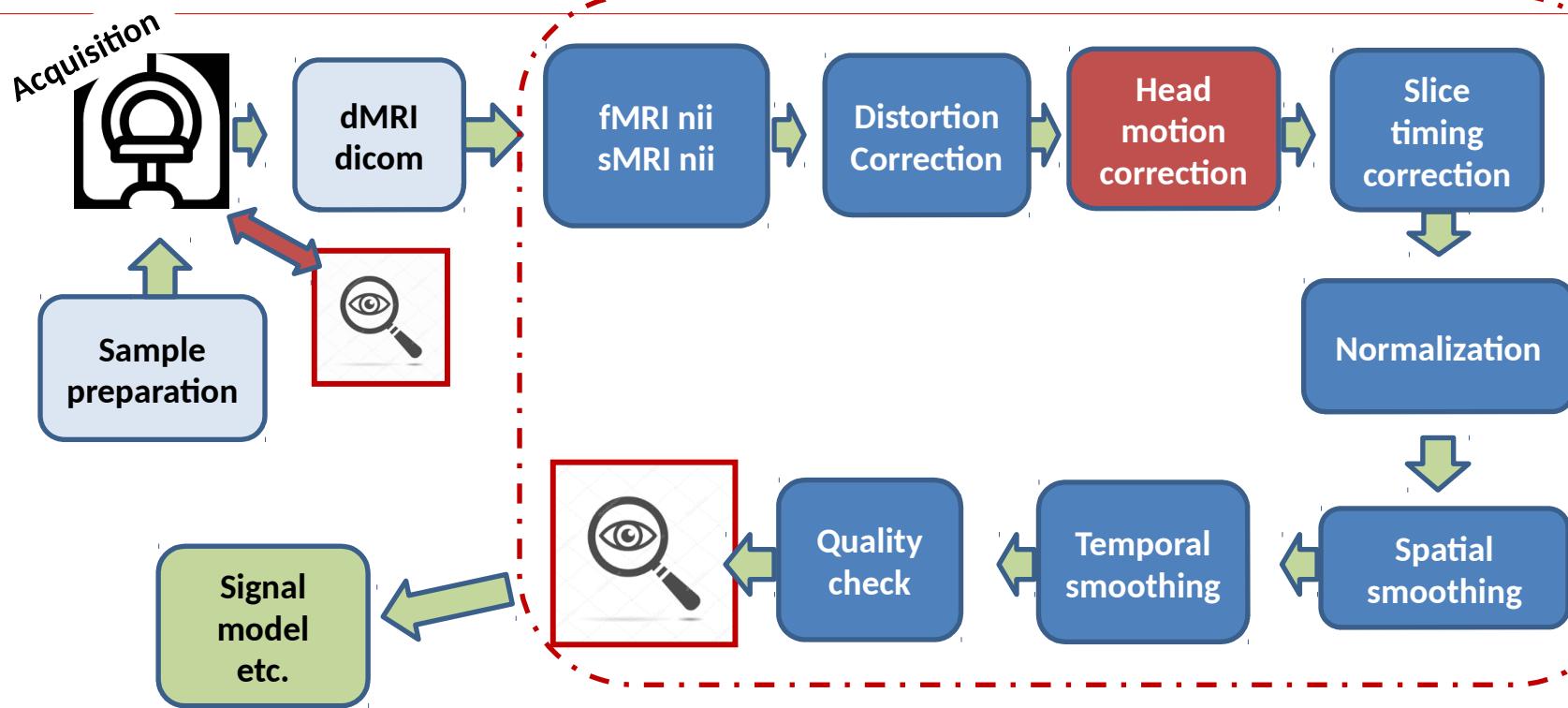
Ventral/amygdala



- A) ~ 2 mm distortions close to the amygdala
- B) 11 mm distortions at the ventricles
- C) 14 mm distortions ant grey matter
- D) Small residual field map errors

fMRI MRI pre-processing

Pre-processing: analyses steps to minimize noise, artifacts to get the «cleanest» data for models



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Jury out for optimal details

Various pre-processing tools available:

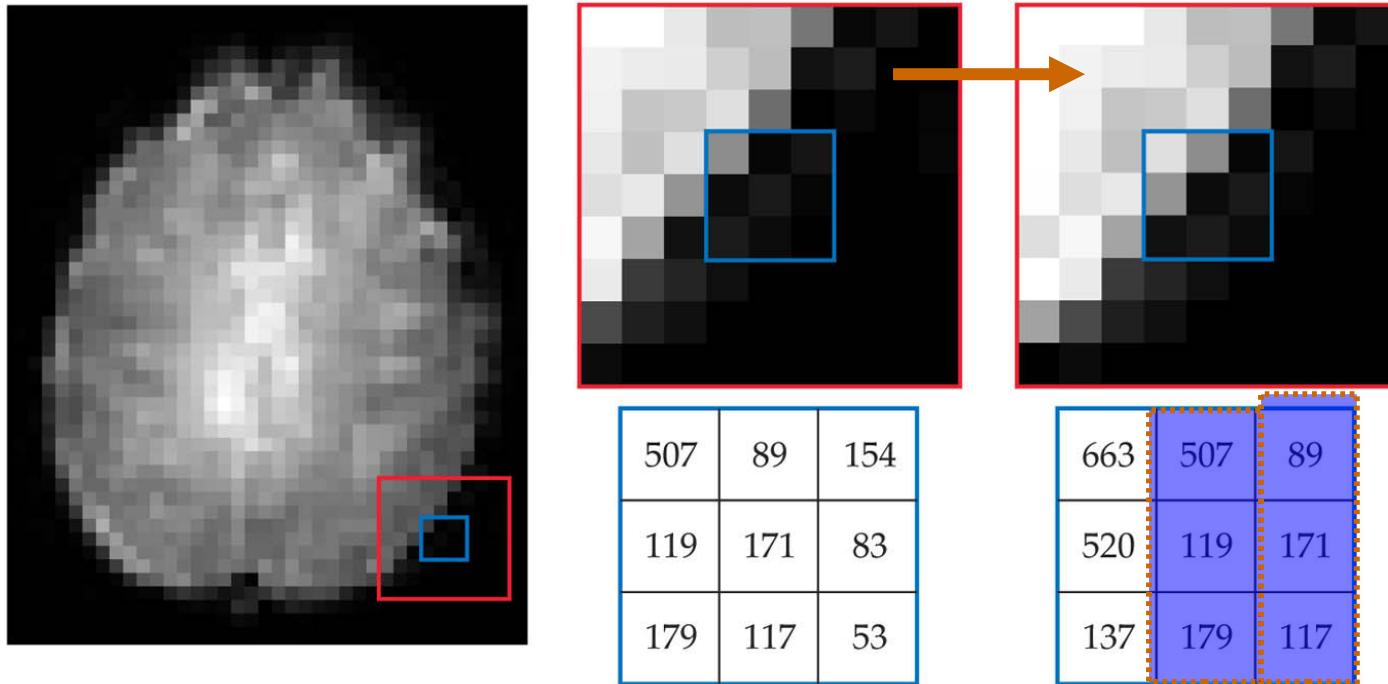
<https://www.fil.ion.ucl.ac.uk/spm/>

<https://fsl.fmrib.ox.ac.uk/fsl>

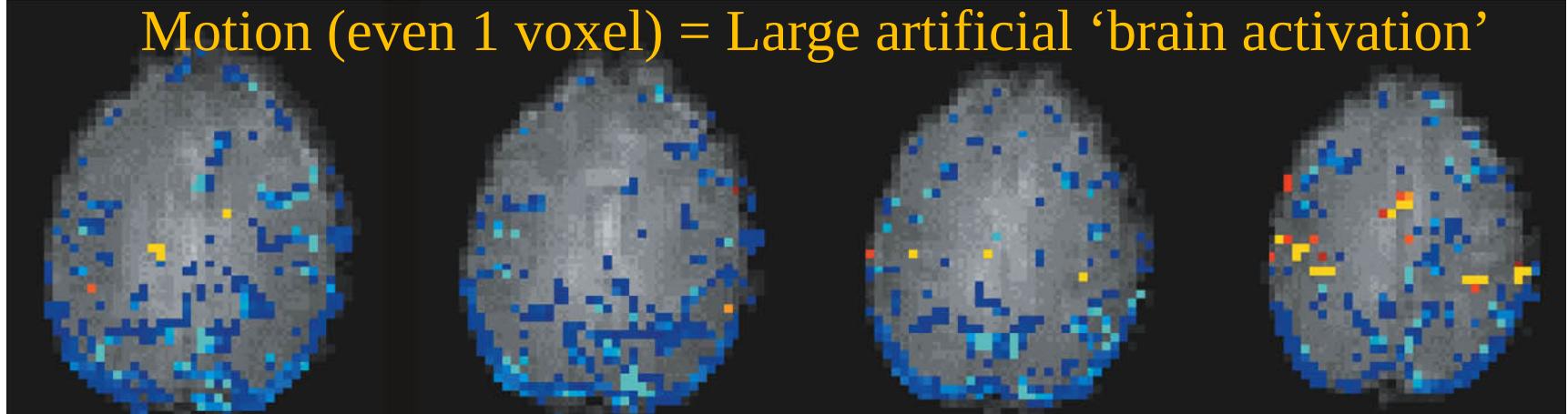
<https://afni.nimh.nih.gov/>

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Head motion effects



Motion (even 1 voxel) = Large artificial ‘brain activation’



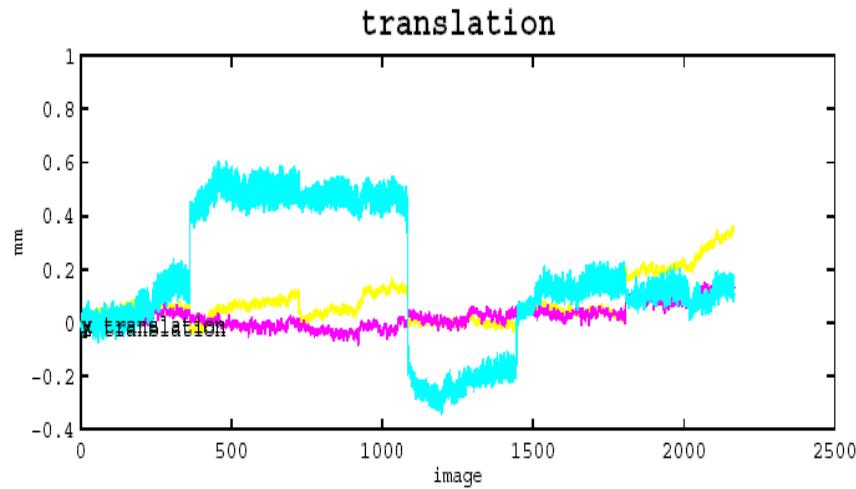
Motion correction: co-registration to reference

- Define a reference image from the EPI time series
- Iteratively co-register (minimize a cost function) each EPI to reference
 - Determine the rigid body transformation that minimizes
 - For each corrected EPI the transformation is defined by
 - 3 translations - in X, Y & Z directions.
 - 3 rotations - about X, Y & Z axes.

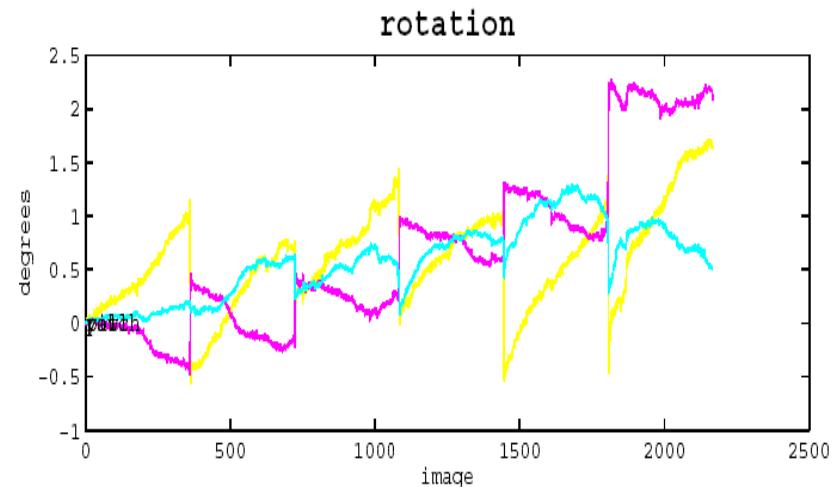
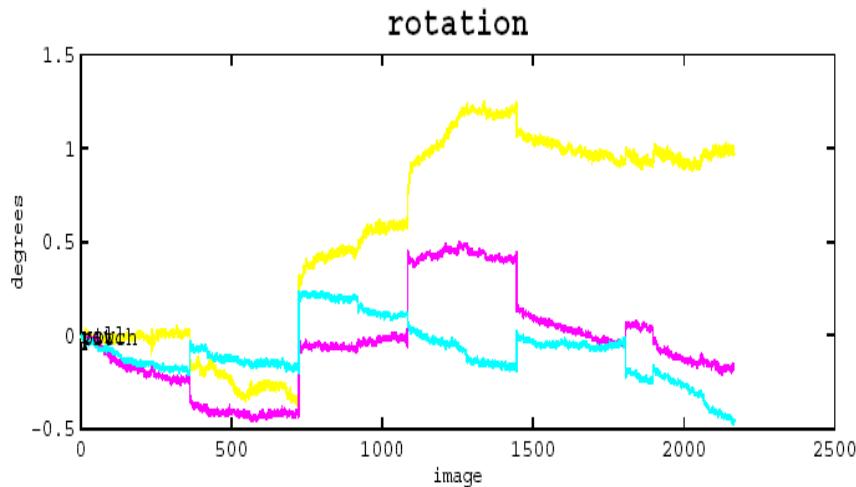
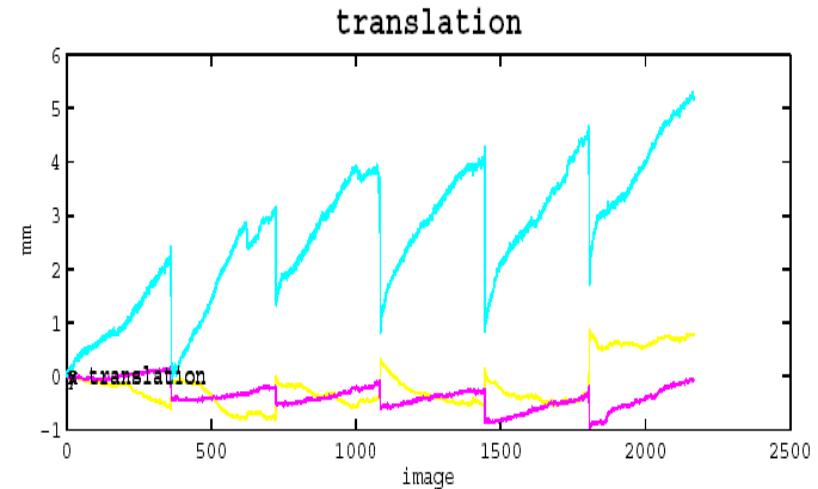


Motion correction results

Could be acceptable motion



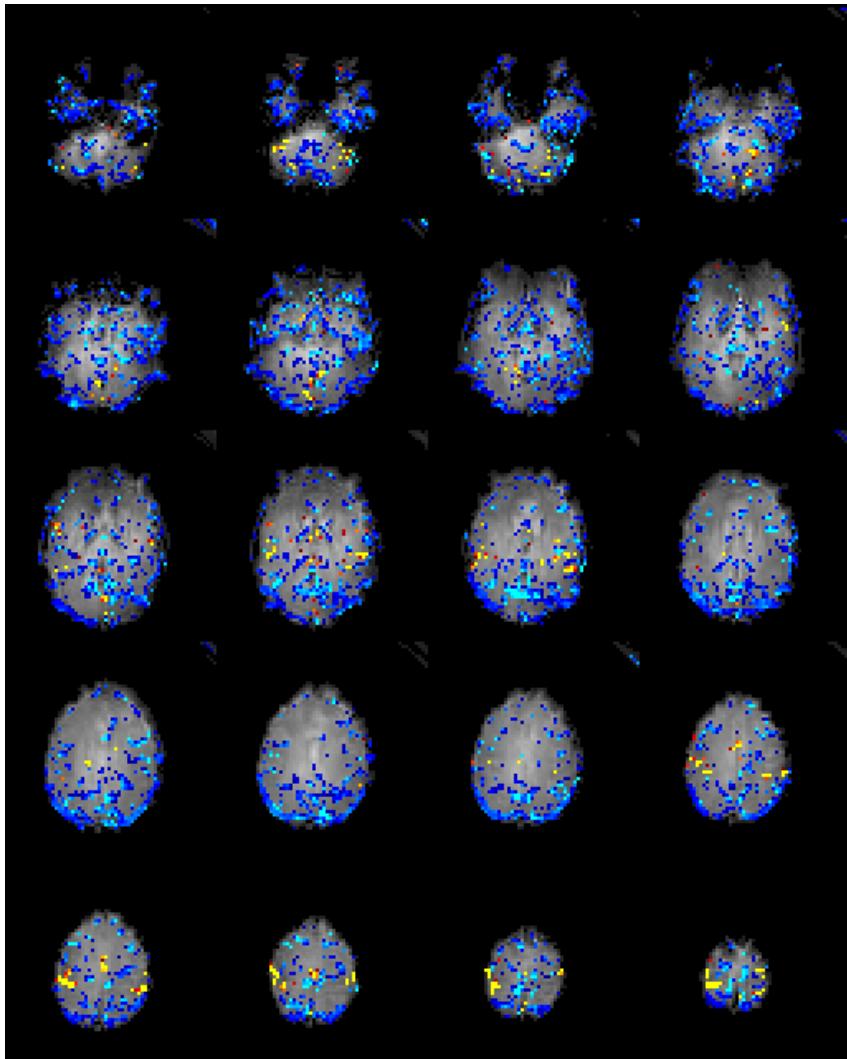
Too much motion (>> 1mm)



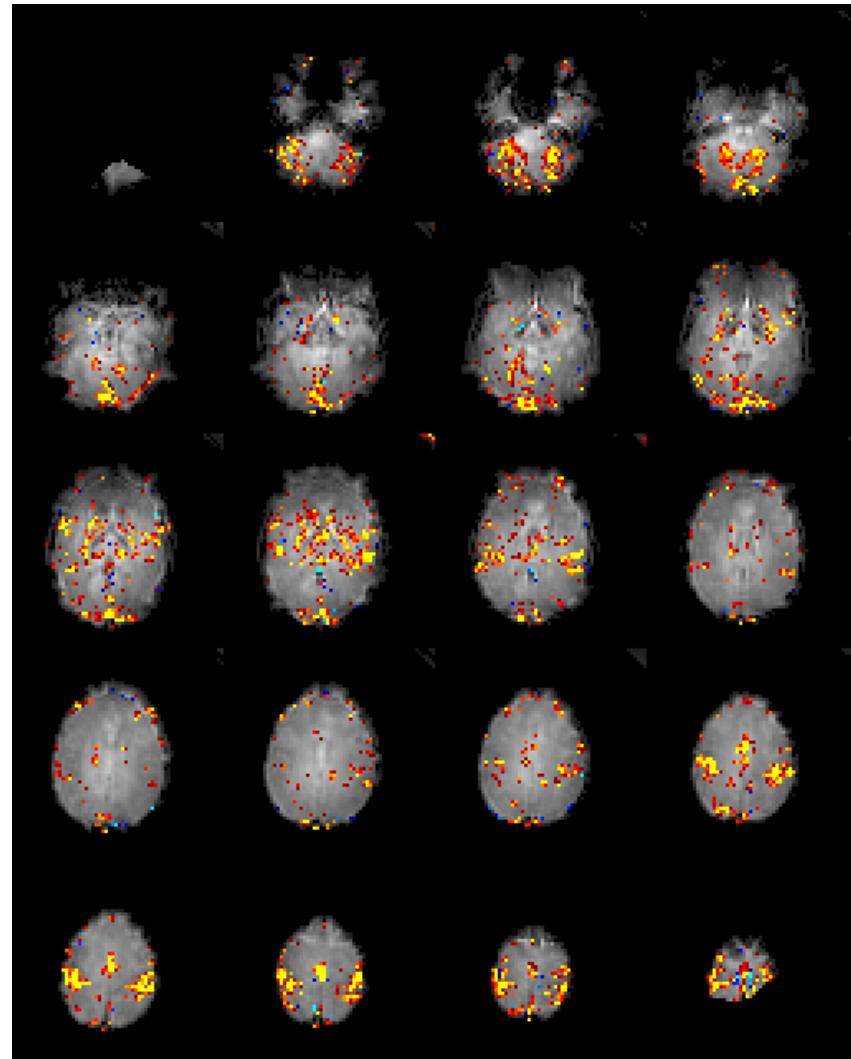
Modified from Source: Huettel S.A., Song A.W., McCarthy G.

Motor fMRI without/with motion correction

Uncorrected

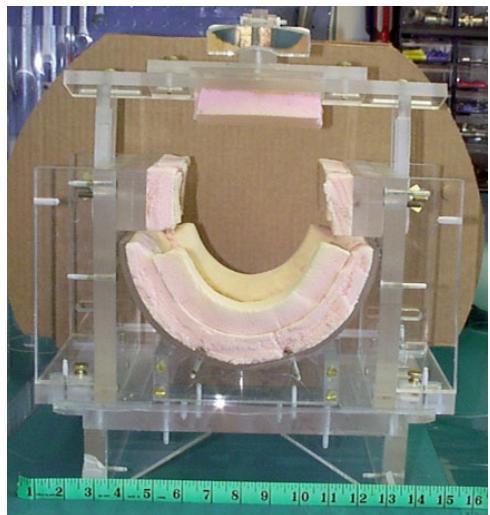


Corrected



Modified from Source: Huettel S.A., Song A.W., McCarthy G.

Reducing head motion



Head Vise
(more comfortable than it sounds!)



Bite Bar



Vacuum Pack



Thermoplastic mask



Often collaboration and foam padding works as well as anything

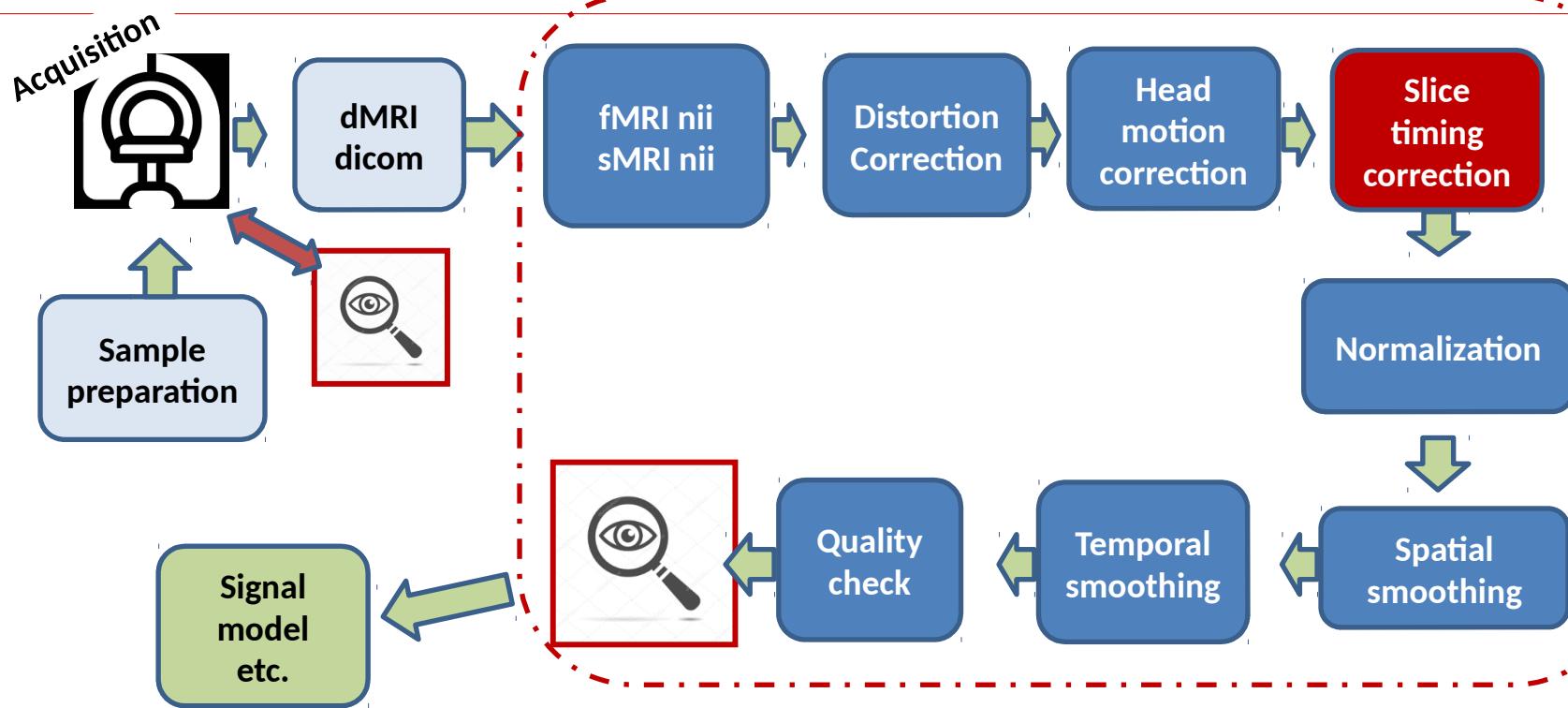
Reducing motion: Prevention best remedy

- Tell your subjects how to be good subjects
 - “Don’t move” is too vague
- Make sure the subject is comfy going in
 - avoid “princess and the pea” phenomenon
- Emphasize importance of not moving at all during beeping
 - do not change posture
 - if possible, do not swallow
 - do not change posture
 - do not change mouth position
 - do not tense up at start of scan
- Discourage any movements that would displace the head between scans
- Do not use compressible head support
- Example of info for first-time subjects:
http://defiant.ssc.uwo.ca/Jody_web/Subject_Info/firsttime_subjects.htm

Source: Jody Culham

fMRI MRI pre-processing

Pre-processing: analyses steps to minimize noise, artifacts to get the «cleanest» data for models



This is a generic example
Jury out for optimal details

Various pre-processing tools available:

<https://www.fil.ion.ucl.ac.uk/spm/>

<https://fsl.fmrib.ox.ac.uk/fsl>

<https://afni.nimh.nih.gov/>

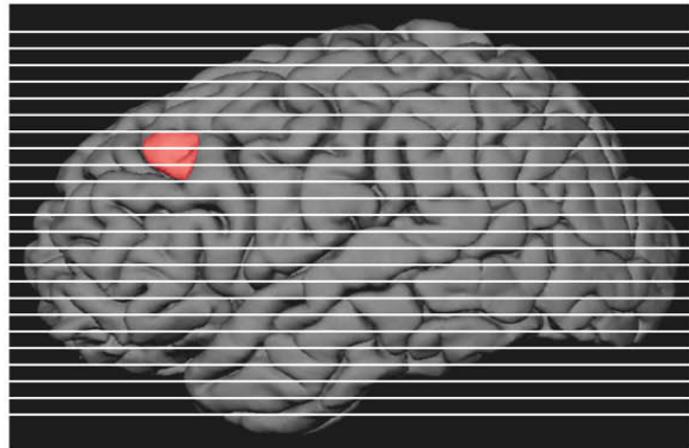
...

Slice acquisition timing correction

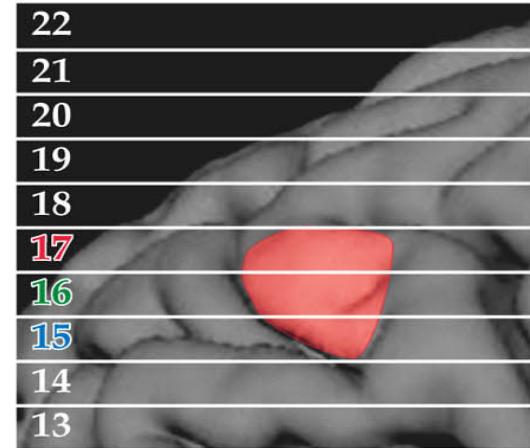
- **The problem:**
 - Ideally
 - Each brain volume is acquired instantaneously
 - Each volume time point represents the cognitive state of the whole brain related to that time point
 - In reality
 - Echo image slice is acquired at a different time
 - Sequential slice acquisition
 - Interleaved slice acquisition
 - Consequence:
 - inaccurate representation of hemodynamic response
- **Solutions:**
 - Reduce the time for whole-brain sampling
 - Postprocessing: temporal interpolation

Slice acquisition timing correction

(A)



The problem



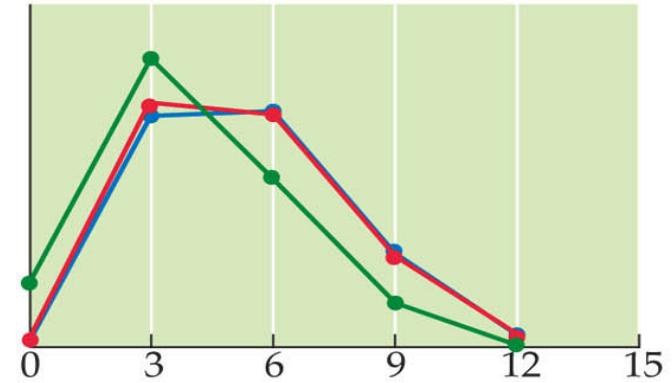
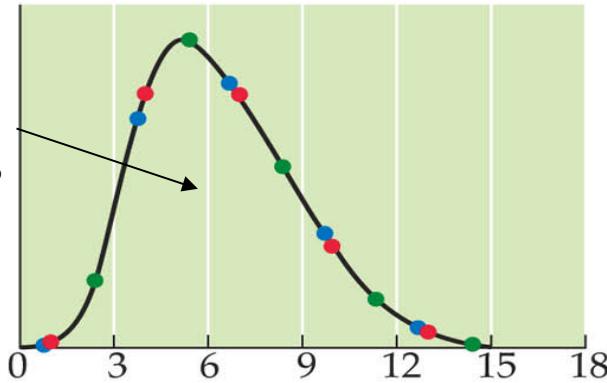
(C)

Interleaved Acquisition
Slice 15, Slice 17, ..., Slice 16

(D)

Time errors: different
responses for different slices.

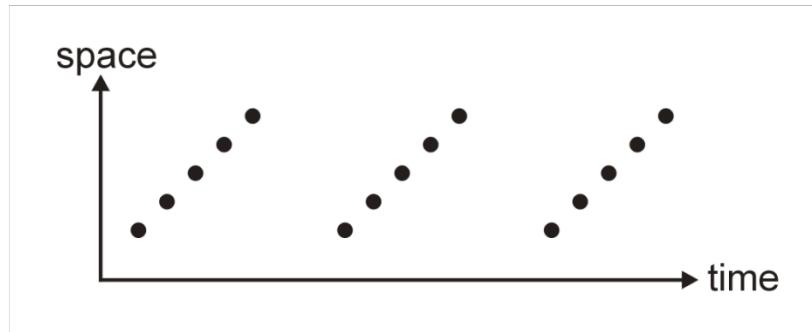
Ideal hemodynamic
response for the active
area: same for all slices



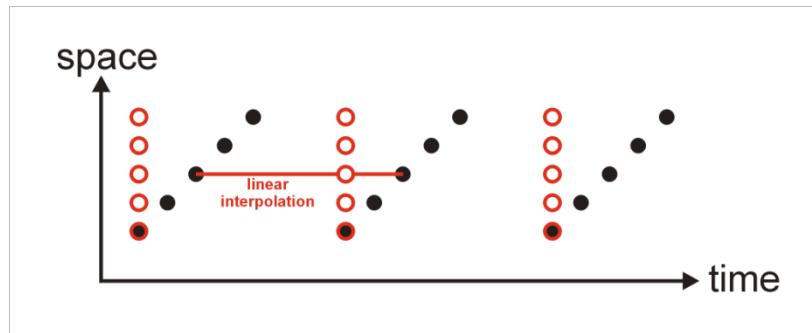
Modified from Source: Huettel S.A., Song A.W., McCarthy G.

Slice acquisition timing correction

- Estimate for each voxel, the signal intensity that would have corresponded to a time shift that aligns all slices to a reference acquisition time.



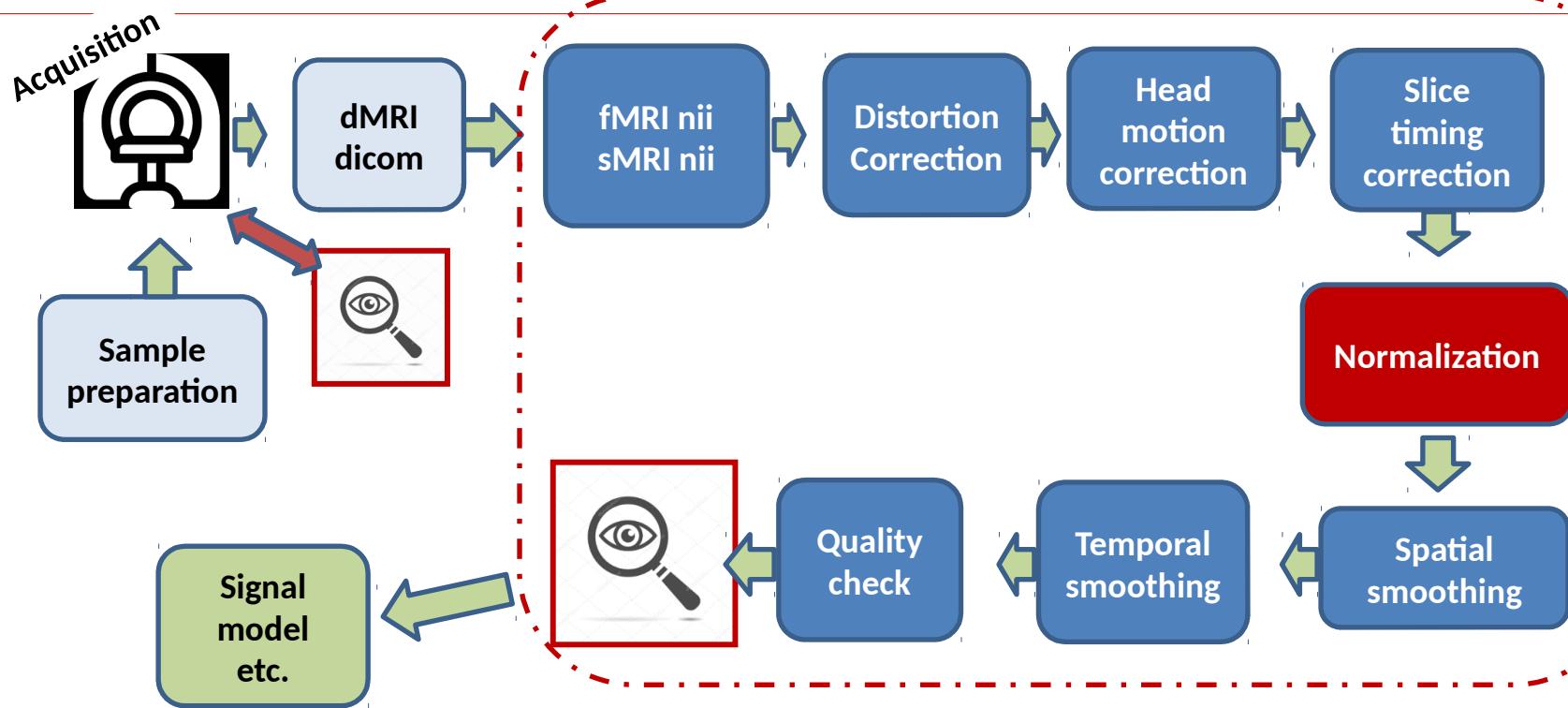
SEQUENTIAL slice acquisition: functional volume are shifted in time



This is corrected
by sinc (or linear)
interpolation in time

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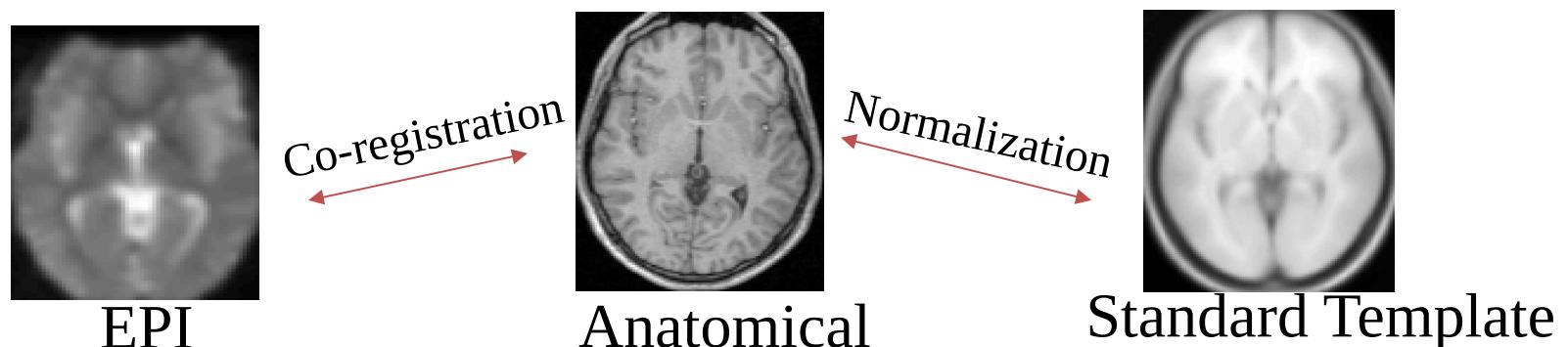
<https://fsl.fmrib.ox.ac.uk/fsl>

<https://afni.nimh.nih.gov/>

...

Co-registrations and Normalization

- Single subject or group analyses:
 - For each subject:
 - Co-registration between fMRI and anatomical scans
 - Rigid body transformation (cost function minimized)
 - This adds an interpolation step (smoothing)
 - Co-registration (normalization) of both (now aligned) to standard atlas
 - For spatial reference
 - Talairach space, or probabilistic atlases, cortical surface based
 - This adds an interpolation step (smoothing)
 - Caveats: normalization space may not represent all subjects

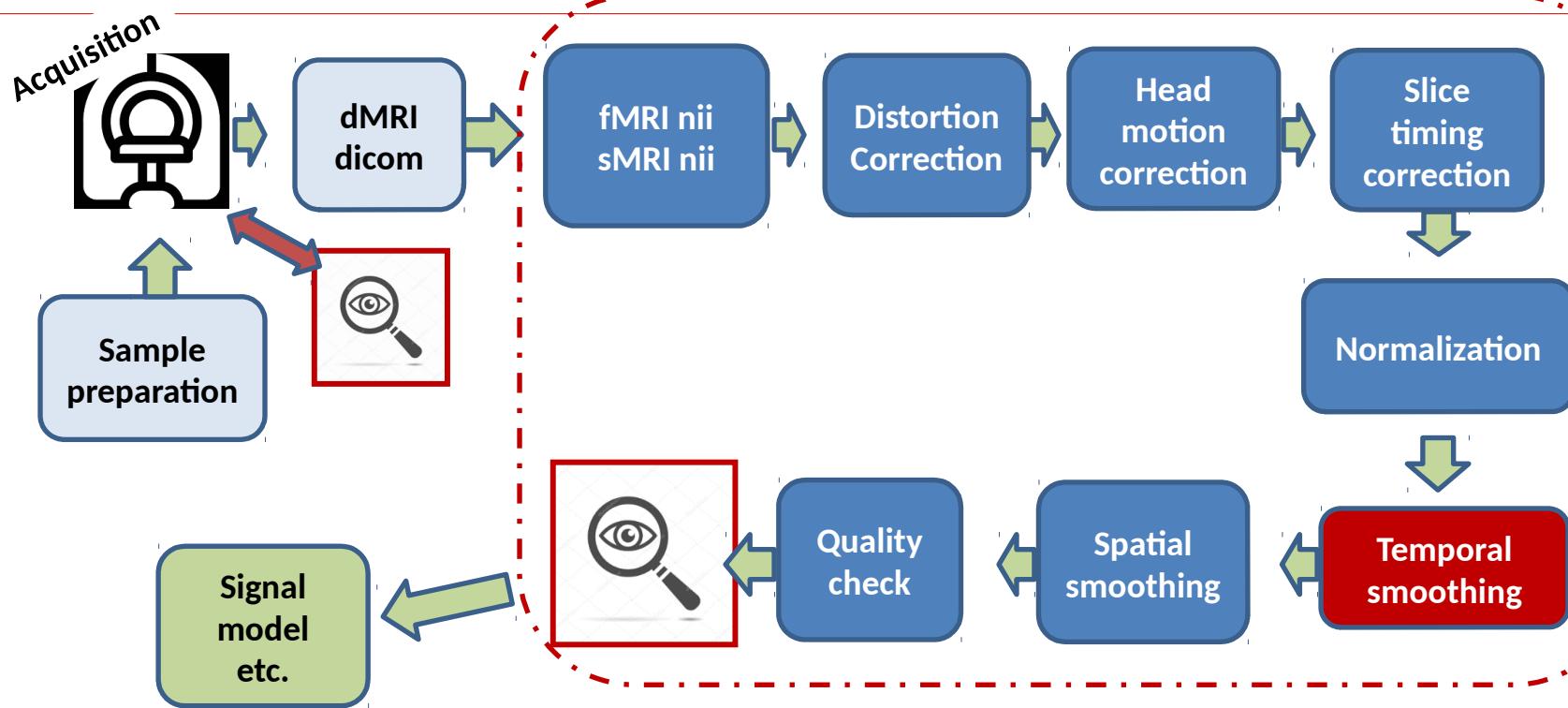


Standardized spaces (brain atlas)

- **Talairach space** (proportional grid system)
 - From atlas of Talairach and Tournoux (1988)
 - Based on single subject (60y, Female, Cadaver)
 - Single hemisphere
 - Related to Brodmann coordinates
- **Montreal Neurological Institute (MNI) space**
 - Combination of many MRI scans on normal controls
 - All right-handed subjects
 - Approximated to Talairach space
 - Slightly larger
 - Taller from AC to top by 5mm; deeper from AC to bottom by 10mm
 - Used by SPM, National fMRI Database, International Consortium for Brain Mapping

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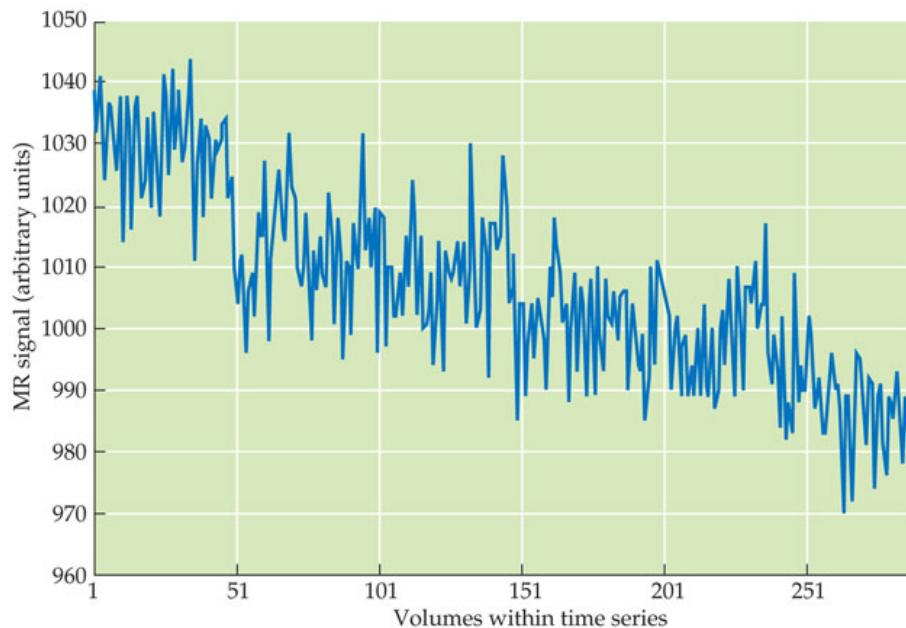
...

Temporal filtering fMRI data

- Goal: remove fluctuations that may be attributed to sources of no interest
- Identify unwanted frequency variation
 - Drift (low-frequency)
 - Physiology: cardiac (1-1.5 Hz), respiratory (0.2-0.3 Hz)
 - Task overlap (high-frequency)
- Reduce power around those frequencies through application of filters
- Potential problem: removal of frequencies composing response of interest

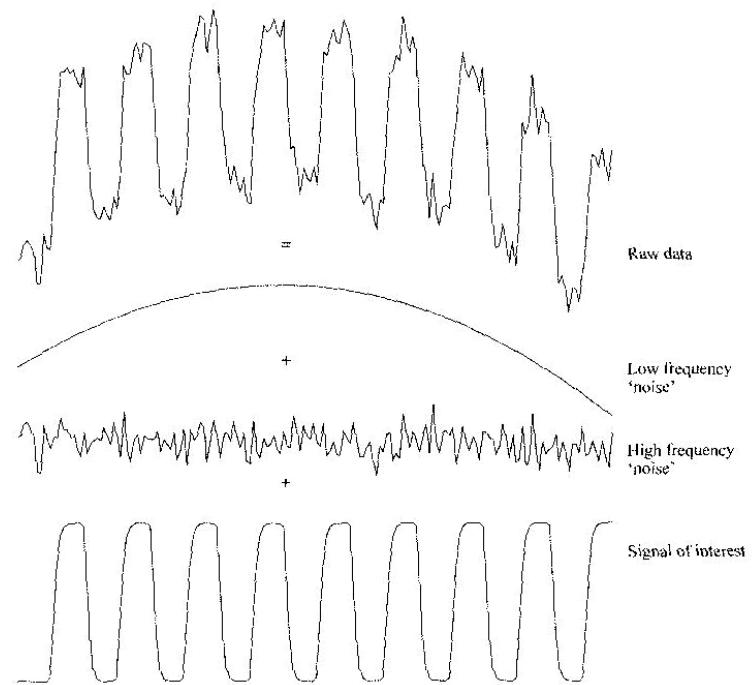
Temporal filtering fMRI data

Signal drifts from hardware instabilities



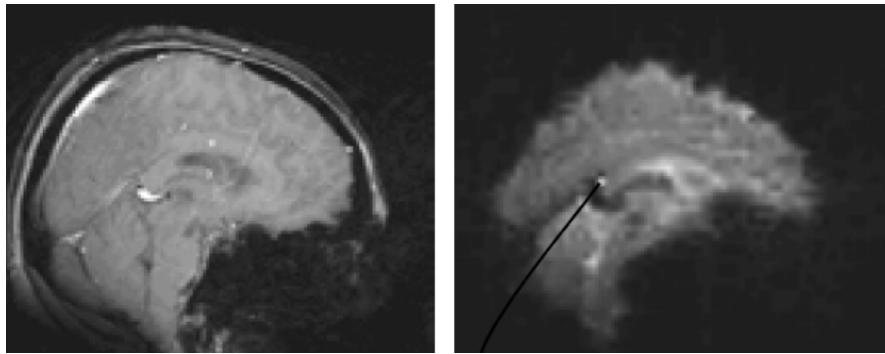
Huettel, Song & McCarthy, 2004,
Functional Magnetic Resonance Imaging

Drift on an activation time course



Source: Smith chapter in Functional MRI:
An Introduction to Methods

Temporal filtering fMRI data



<http://www.fil.ion.ucl.ac.uk/spm/course/>

Respiration

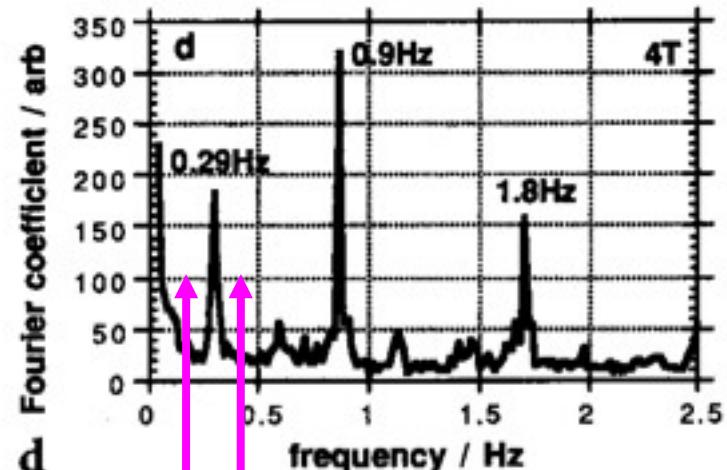
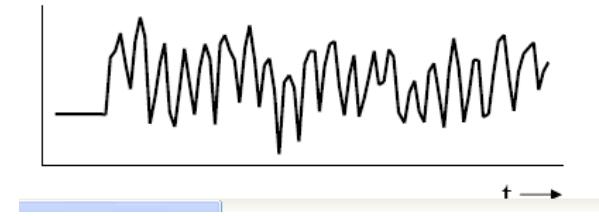
- Every 4-10 sec (0.3 Hz)
- Moving chest distorts susceptibility

Cardiac Cycle

- Every ~1 sec (0.9 Hz)
- Pulsing motion, blood changes

Solutions

- Gating
- Filter AND avoiding paradigms at those frequencies



You want your paradigm frequency to be in a “sweet spot” away from the noise

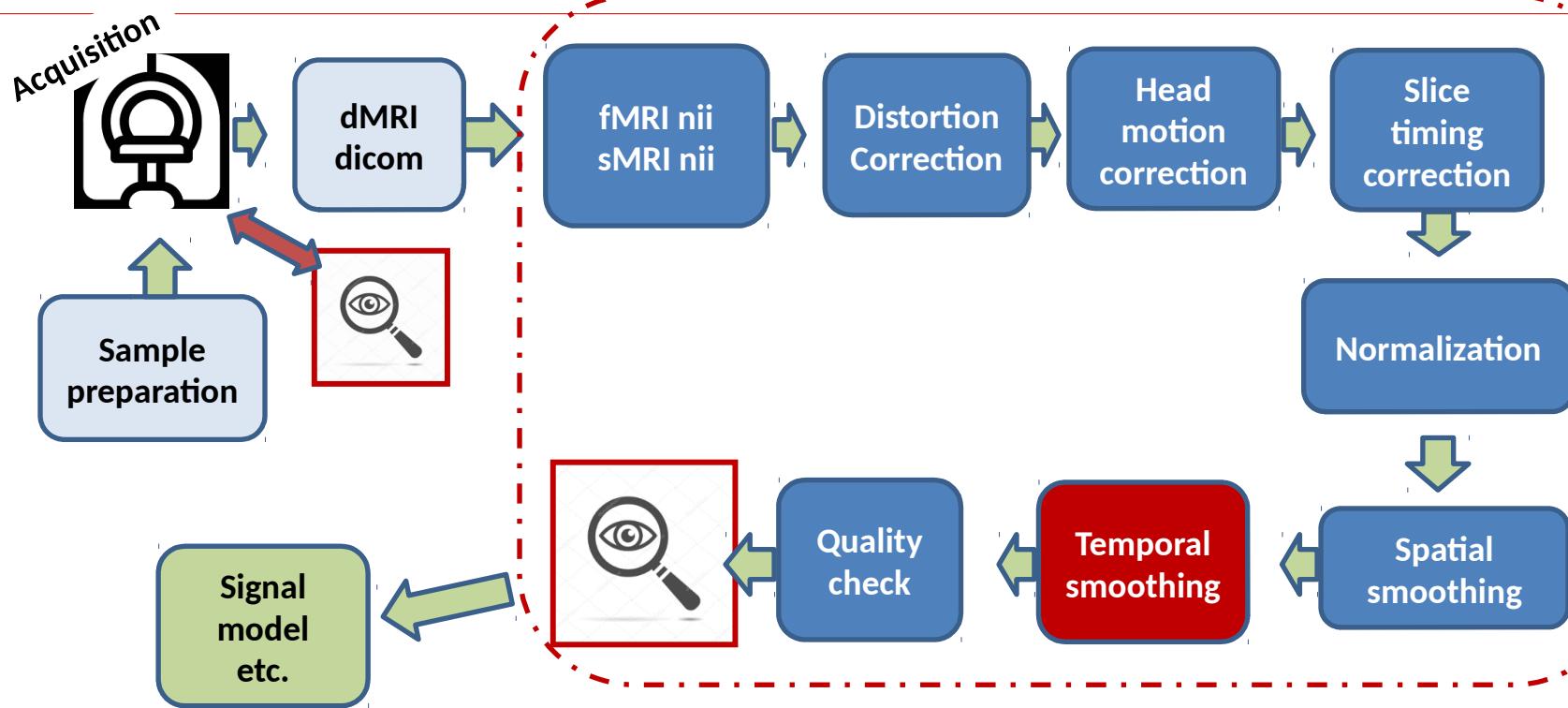
Source: Jody Culham

Jorge Jovicich

CIMeC, University of Trento, Italy

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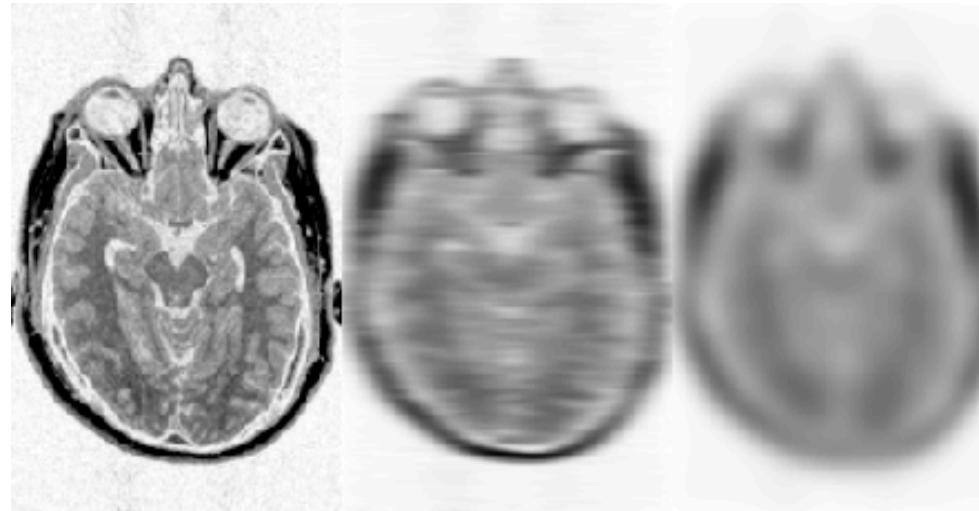
...

Spatial smoothing

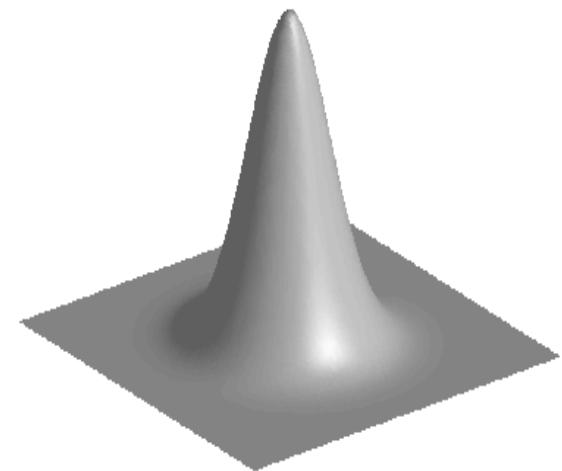
Spatial smoothing essentially ‘blurs’ your functional data.

Why would you ever want to reduce the spatial resolution of your data?

Spatial smoothing may often be required when averaging data across several subjects due to the individual variations in brain anatomy and functional organization.



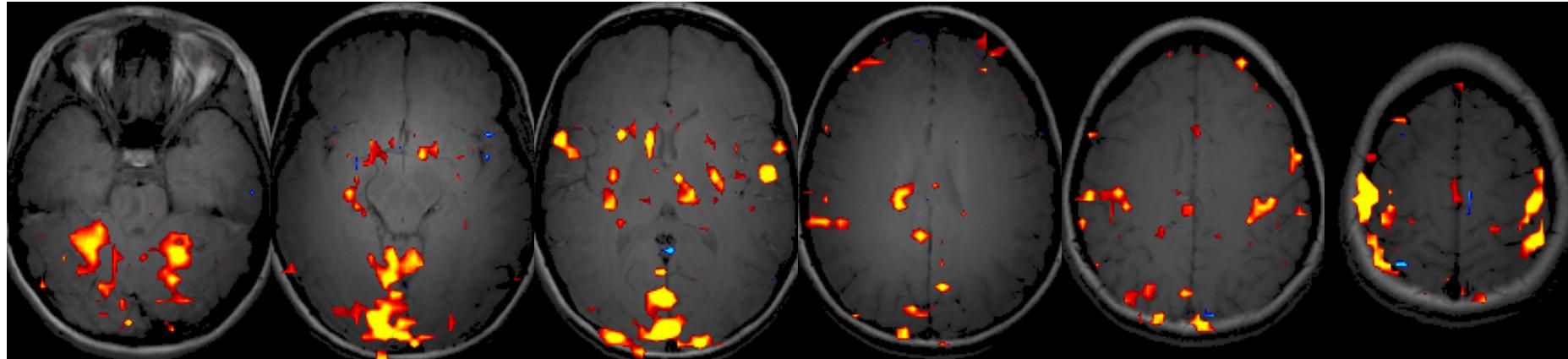
Increased degrees of smoothing (FWHM)



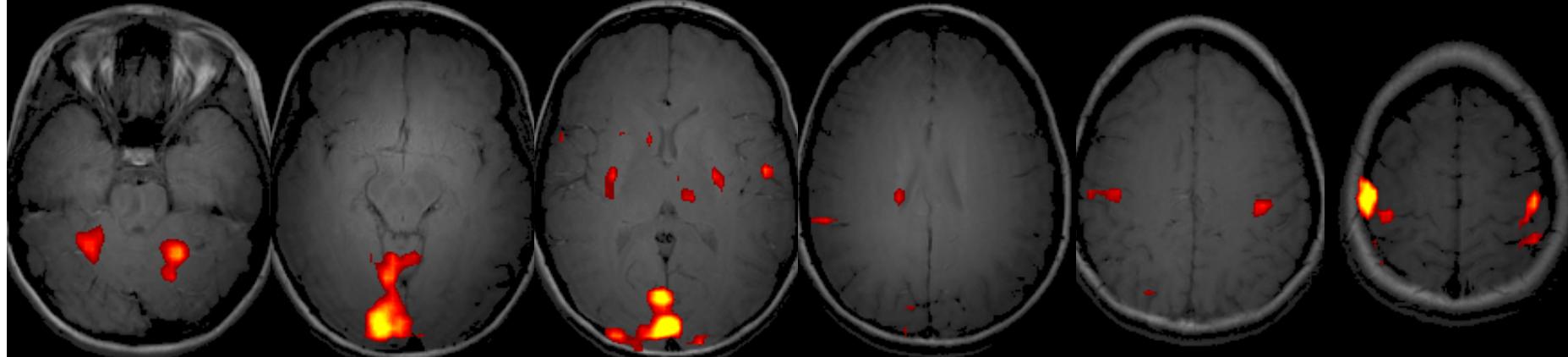
Gaussian smoothing kernel

Spatial smoothing: reducing false positives

Unsmoothed Data

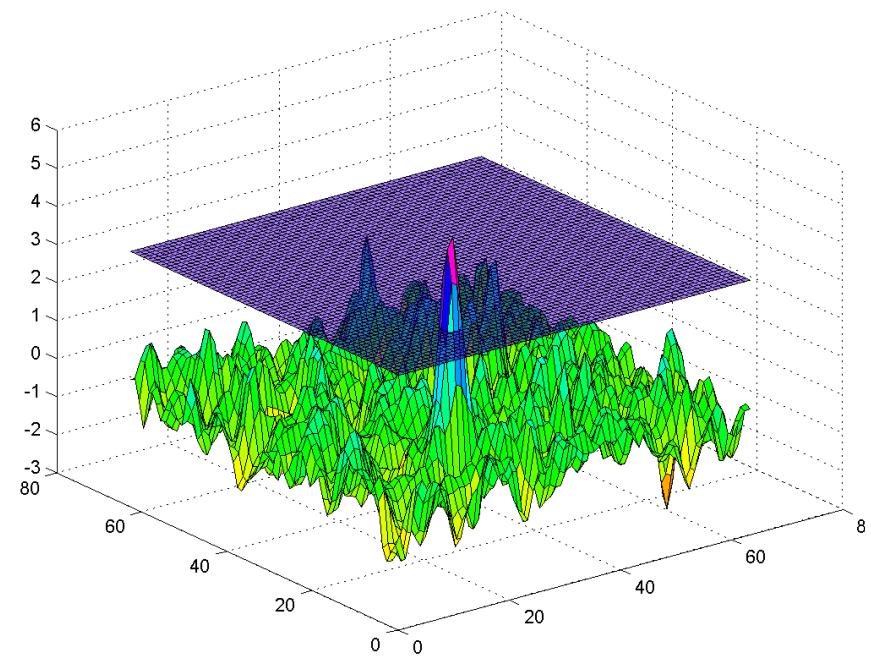
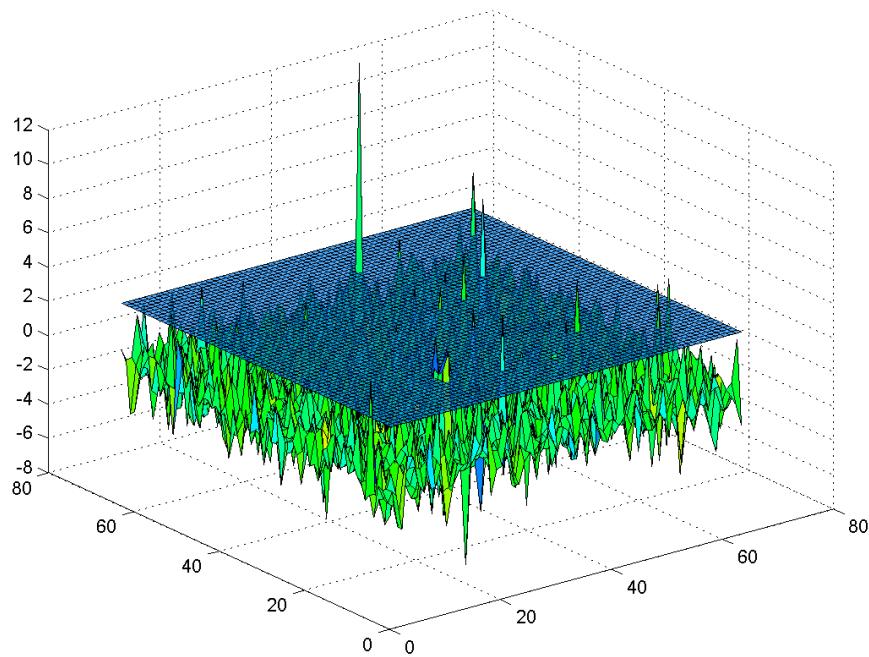


Smoothed Data (kernel width 5 voxels)



Modified from Source: Huettel S.A., Song A.W., McCarthy G.

Spatial smoothing: reducing false positives



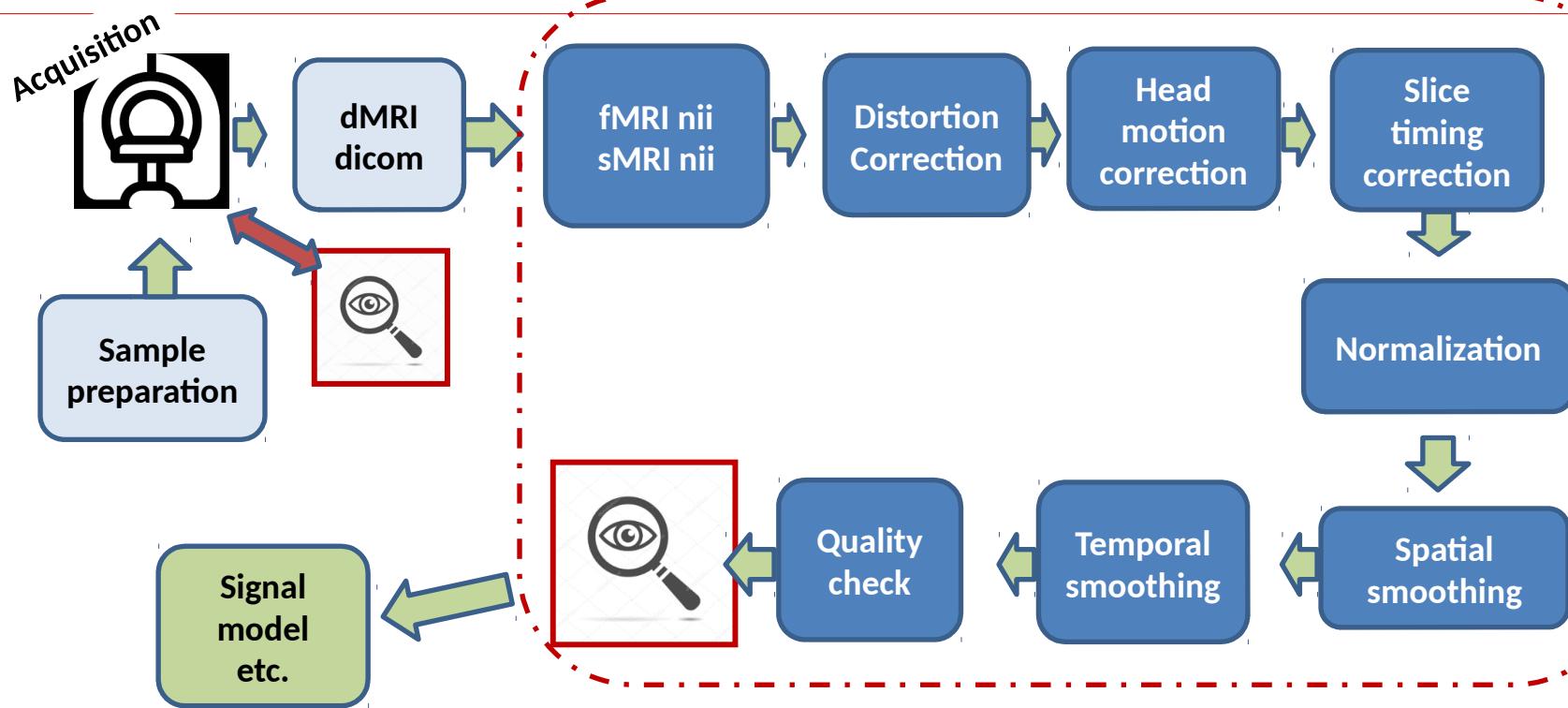
Modified from Source: Huettel S.A., Song A.W., McCarthy G.

Spatial smoothing

- **Advantages**
 - Increases Signal to Noise Ratio (SNR)
 - Matched Filter Theorem: Maximum increase in SNR by filter with same shape/size as signal
 - Reduces number of comparisons
 - Allows application of Gaussian Field Theory
 - May improve comparisons across subjects
 - Signal may be spread widely across cortex, due to intersubject variability
 - **Disadvantages**
 - Reduces spatial resolution
 - Challenging to smooth accurately if size/shape of signal is not known
- Notes:**
- Often used in general linear model analysis
 - Often not used in layer fMRI

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<https://fsl.fmrib.ox.ac.uk/fsl>

<https://afni.nimh.nih.gov/>

...

Literature recommendations include

Collection of overview papers from various leaders in the field

- [20 years of fMRI](#)
- [Reproducibility in Neuroimaging](#)
- [MRI of cortical layers](#)
- [Cleaning up fMRI time series](#)

Web materials:

- <https://practicalfmri.blogspot.com/>
- <http://www.fmri4newbies.com/>
- OHBM Educational Series: <https://www.pathlms.com/ohbm/courses/> (tons of stuff!)
- ISMRM Educational Series: <https://www.ismrm.org/education/>
 - <https://www.ismrm.org/online-education-program/diffusion-perfusion-fmri-videos/>
- <https://gate.nmr.mgh.harvard.edu/wiki/whynhow/>

Concept map for lectures

Lecture 1

NMR Signal origin

- Powerful magnet
- Radio frequency
- Magnetic field gradients

MR Image & Contrast

- Spatial encoding
- Magnetic gradients
- Pulse sequences

MR Safety

- Powerful magnet
- Radio frequency
- Magnetic field gradients

Lecture 2

Structural MRI

- Contrast, important parameters
- Sequences & artifacts
- Analyses & applications



Lecture 3

Diffusion MRI

- Contrast, important parameters
- Sequences & artifacts
- Analyses & applications

Lecture 4

Functional MRI

- Contrast, important parameters
- Sequences & artifacts
- Pre-processing

Acknowledgements



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D. Zacà



C. Maffei



V. Iacovella



N. Pace



L. Novello



F. Saviola



M. Akinci

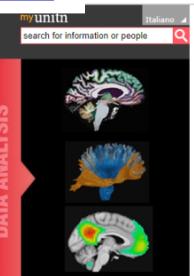


S. Tambalo



<http://r.unitn.it/en/cimec/mri>

MRI
Magnetic Resonance Imaging Methods Group



Current/recent
lab include

TONIGHT (<http://www.milonga.be>)

TANGO BAR
21:30 - 02:00

Rue de Dublin 13, 1050 Ixelles,
Belgium
MILONGA BRUSSELS