



Quality Assurance & Pre-Processing in fMRI



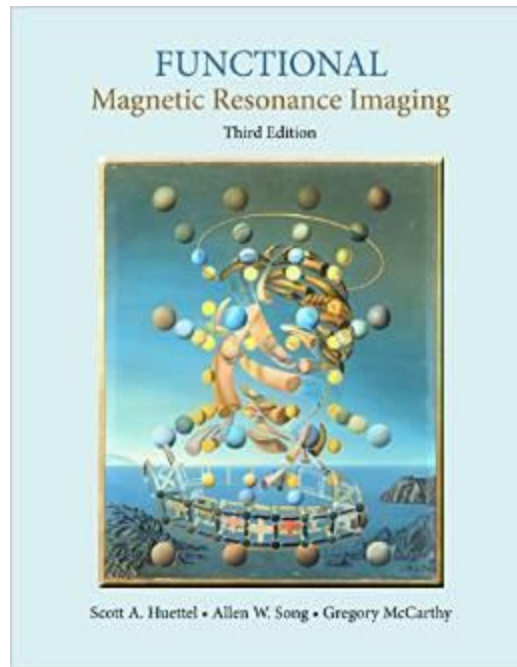
吳建德

台灣大學 職能治療學系

References



劉鶴齡 教授



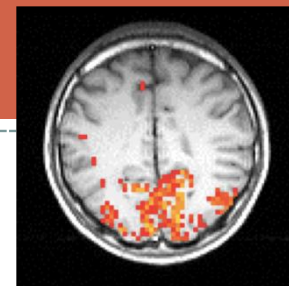
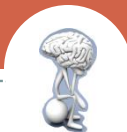
Huettel, Song & McCarthy, 2014



吳昌衛 教授

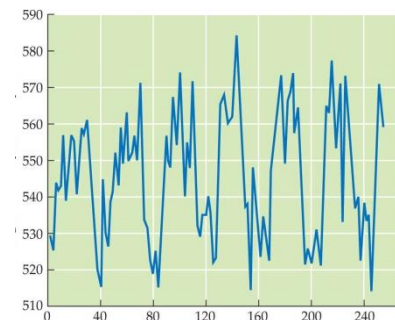
Procedures of a typical fMRI study

Hypothesis



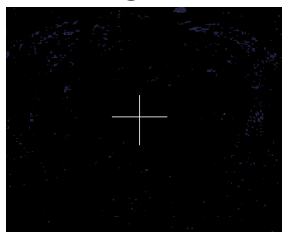
Brain activity

Statistical Analysis

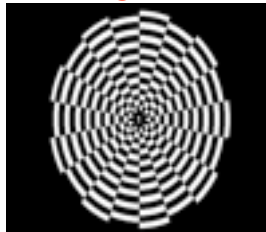


Measured MR signal

OFF



ON

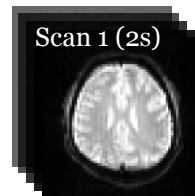


OFF ON OFF ON OFF ON OFF ON

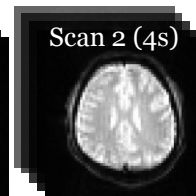
Experimental Design



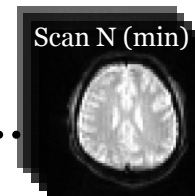
Scan 1 (2s)



Scan 2 (4s)

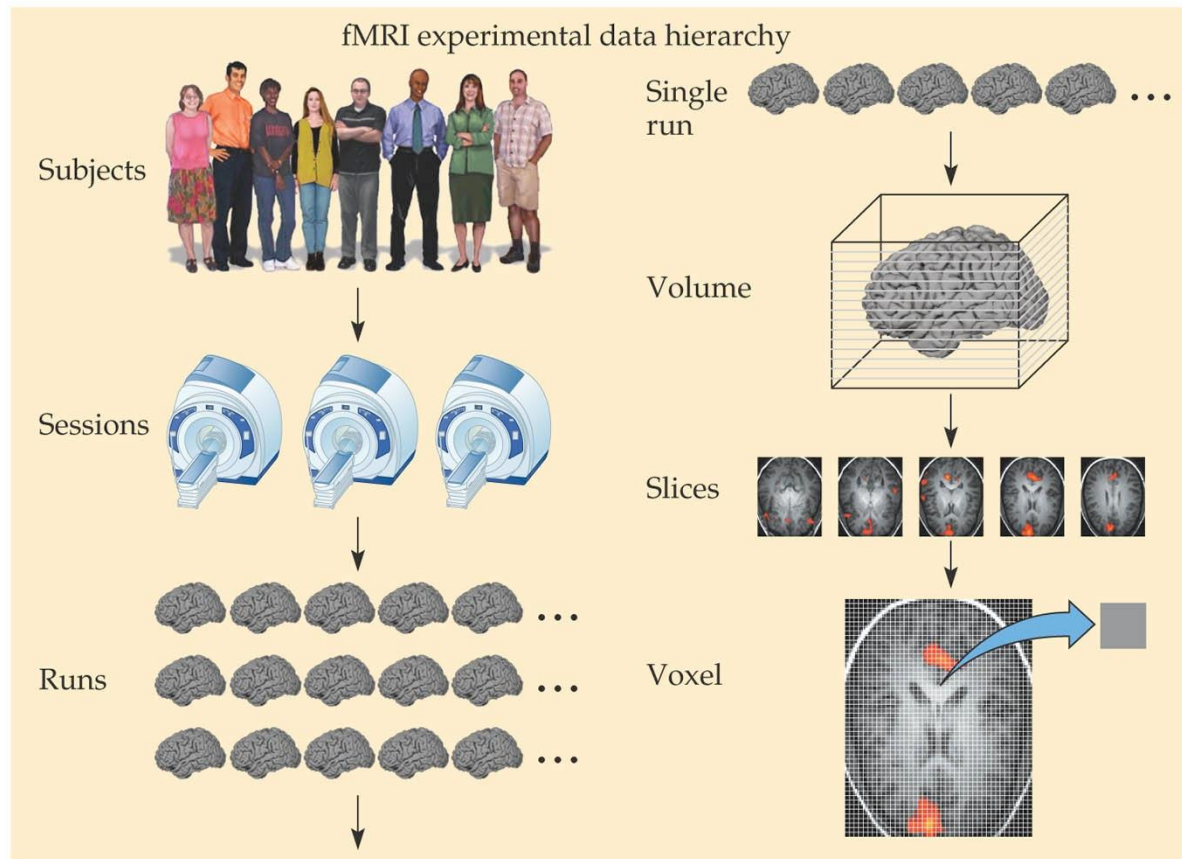


Scan N (min)



Physiological Response

What are the DATA?

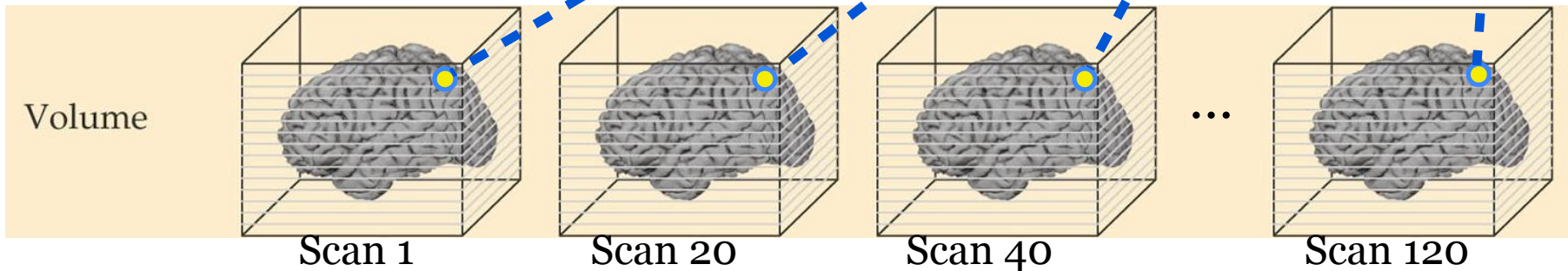
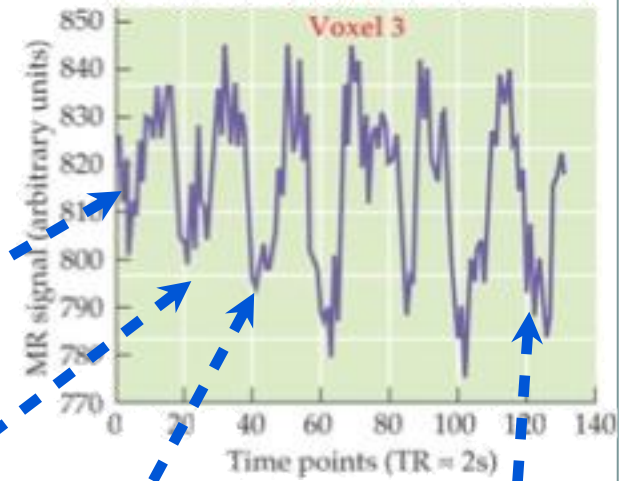


Huettel et al. *Functional Magnetic Resonance Imaging* 2004

DATA structure: 4 dimensions



❖ fMRI signal \rightarrow **(x, y, z + time)**



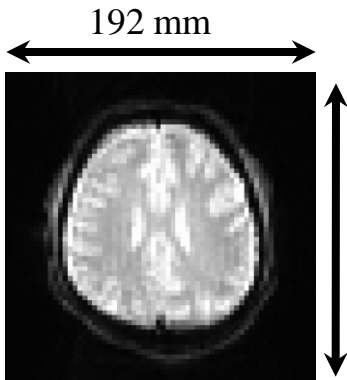
The Spatial Domain



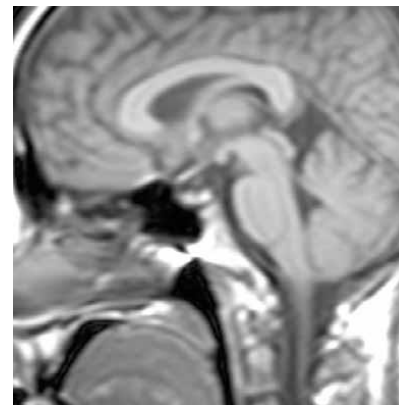
Field of view (FOV) & Matrix size (MTX)

一個volume的空間大小， 決定了空間解析度

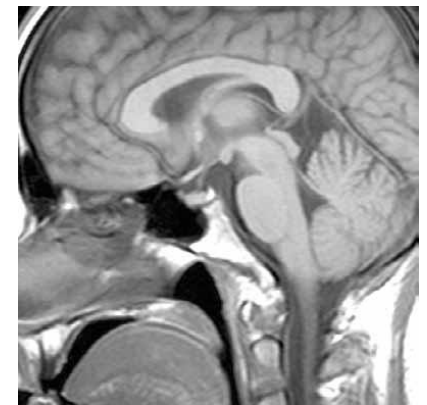
$$\text{Pixel size} = \frac{\text{FOV}}{\text{Matrix size}}$$



Example: EPI 64 x 64 → spatial resolution = 3 x 3 mm²

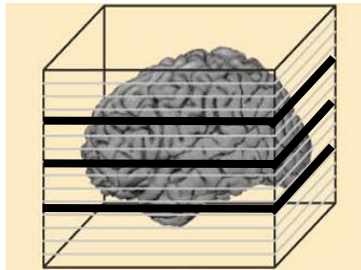


64 x 64



128 x 128

The Time Domain

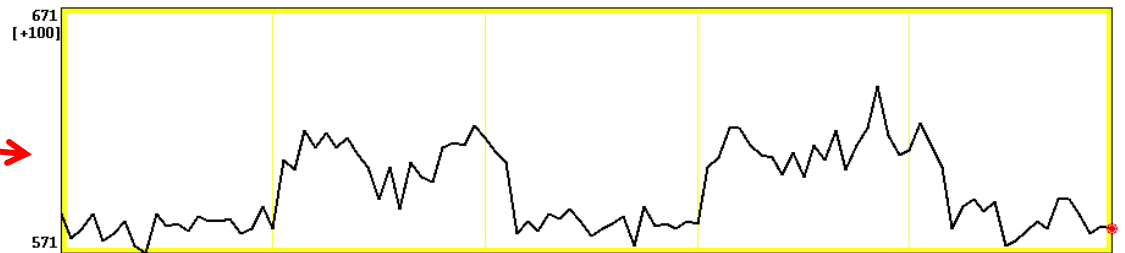
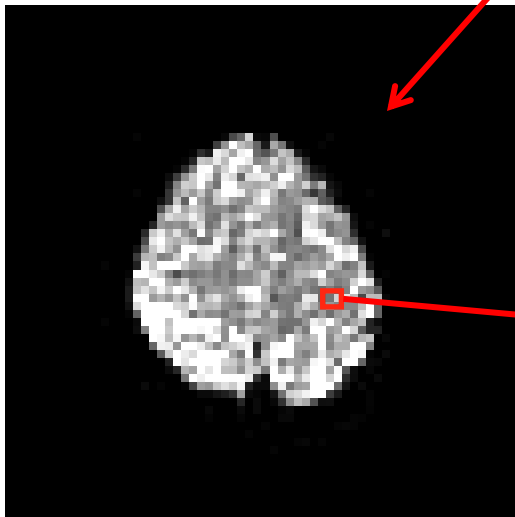
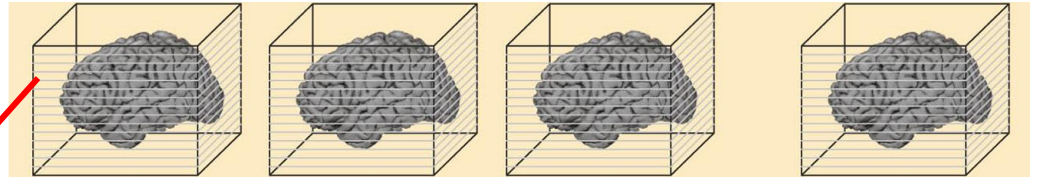


Scan 1

Scan 2

Scan 3

Scan N



Artifacts (假影)



QA

Realign-
ment

Slice
timing

Coregist
ration

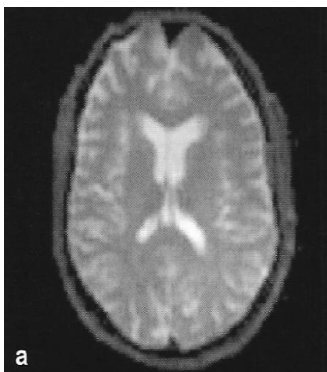
Normali
zation

Smooth

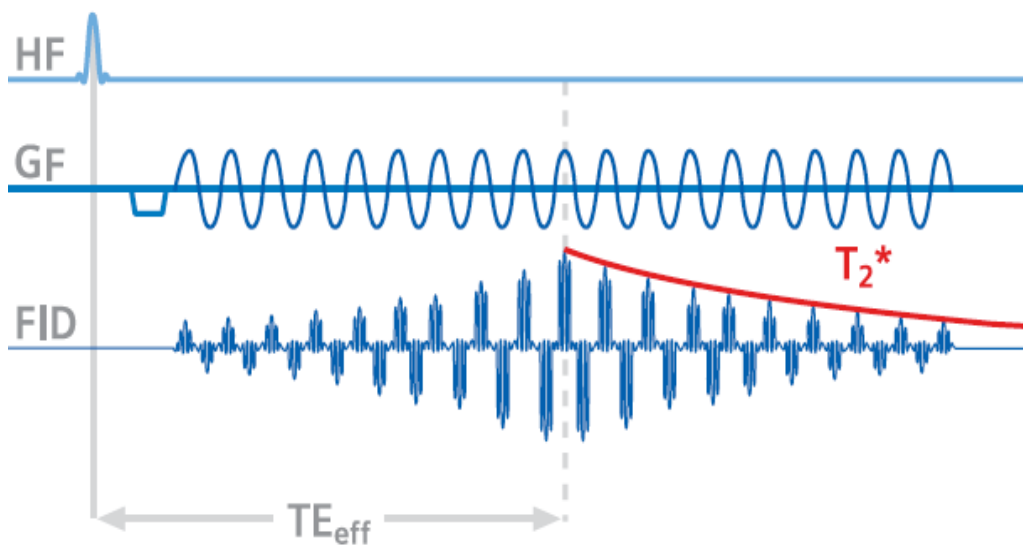
Segment
ation



Peter Mansfield
(1933-) UK



史上最快速成像序列(單張影像 $<0.1s$)
，卻也有最多的影像假影與麻煩…



Artifacts (假影)



QA

Realign-
ment

Slice
timing

Coregist
ration

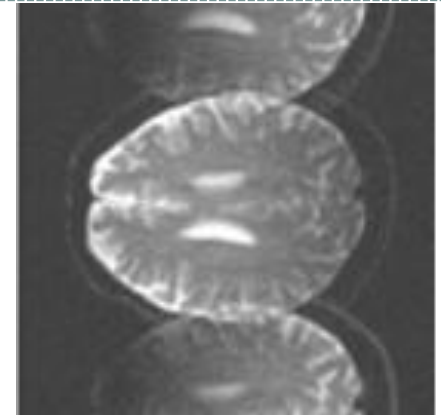
Normali
zation

Smooth

Segment
ation

❖ N/2 Ghost

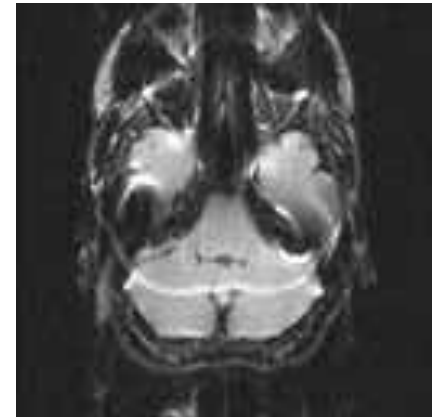
Unmatched lines in k-space



N/2 ghost

❖ Chemical shift

Resonance difference btw
lipid / water



Chemical shift

Solution:

Adjust k-space signal

Saturation pulse

Artifacts (假影)



QA

Realign-
ment

Slice
timing

Coregist
ration

Normali
zation

Smooth

Segment
ation

❖ Distortion

Susceptibility difference

❖ Signal Drop

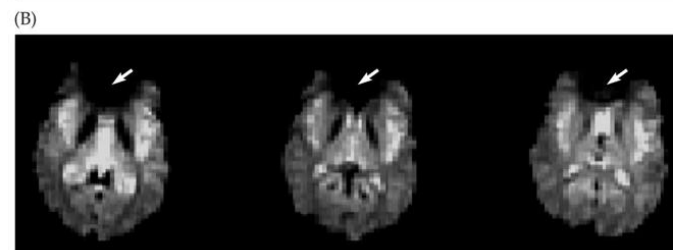
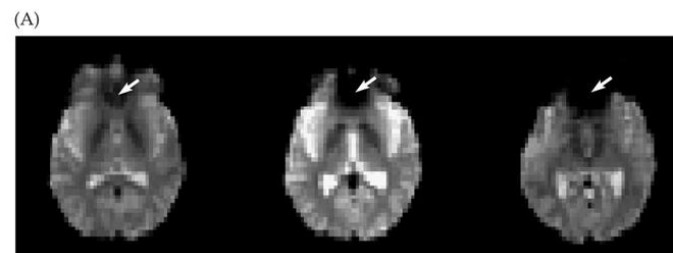
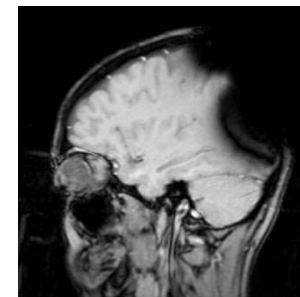
significant in OFC!

Solution:

Correct using field map

Z-shim

Additional shim coil



Source: FSL 2010 course. *FEAT*

Artifacts (假影)



QA

Realign-
ment

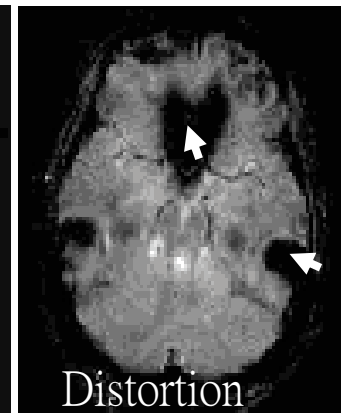
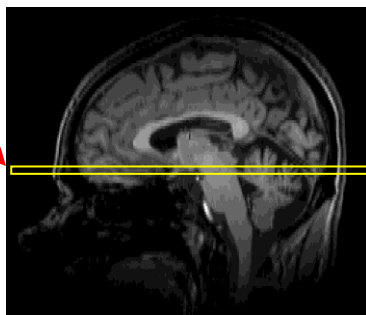
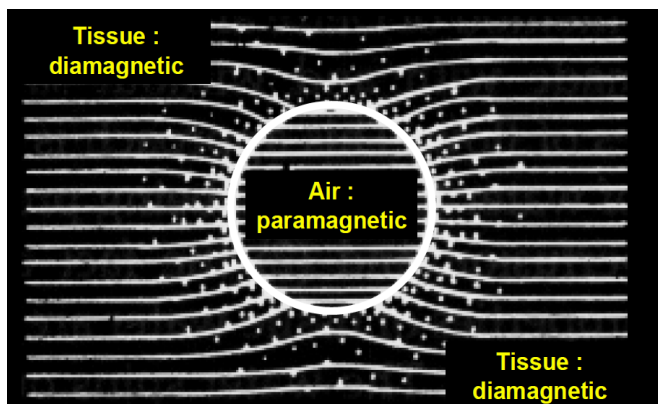
Slice
timing

Coregis-
tration

Normali-
zation

Smooth

Segment-
ation



*Courtesy of Prof. Karla L. Miller, Oxford
University*

Artifacts (假影)



QA

Realign-
ment

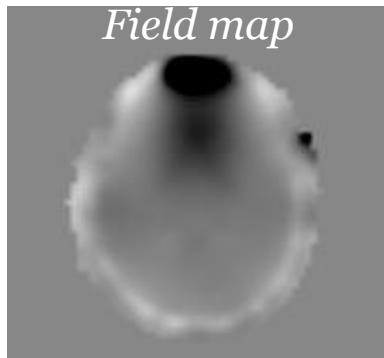
Slice
timing

Coregist-
ration

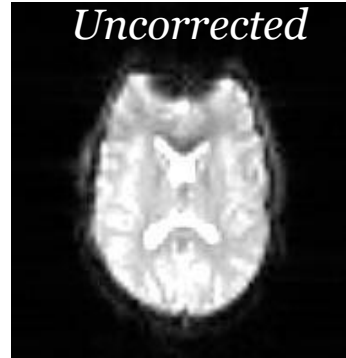
Normali-
zation

Smooth

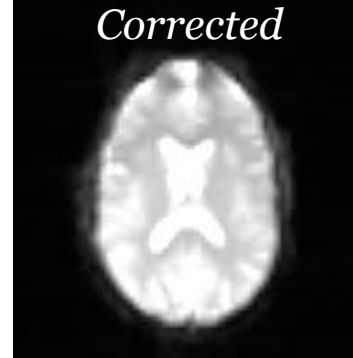
Segment-
ation



Field map



Uncorrected

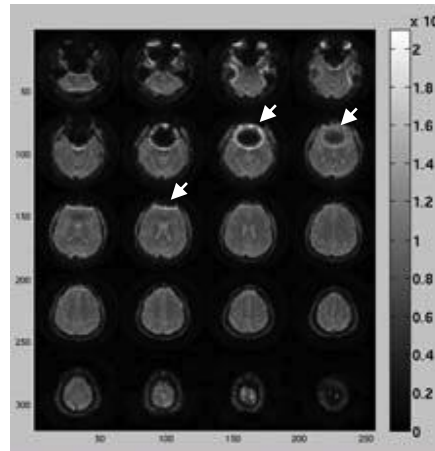


Corrected

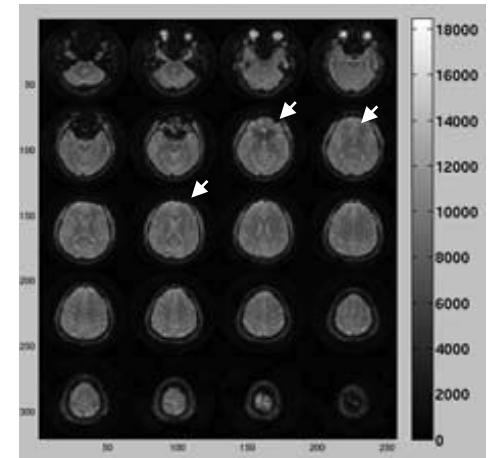
- New machine has built-in “field-map” sequences.
- Take another 1-2 min only.

- Remove part of distortion.
- Introduce slight blurring.

Before correction



After correction



Artifacts (假影)



QA

Realign-
ment

Slice
timing

Coregist-
ration

Normali-
zation

Smooth

Segment-
ation

❖ RF leakage

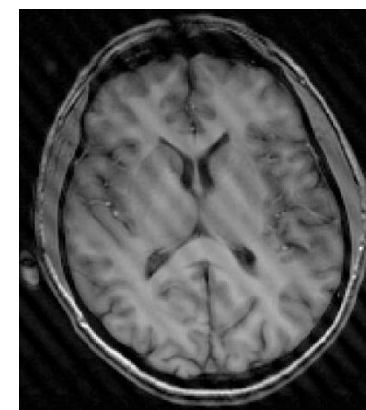
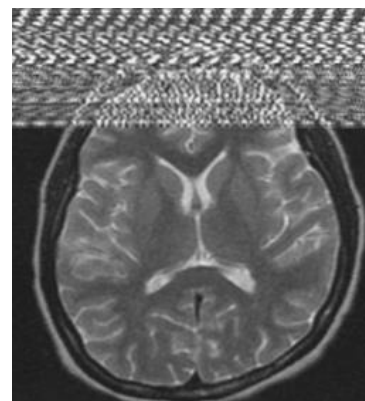
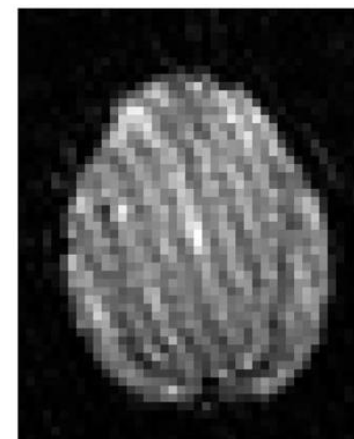
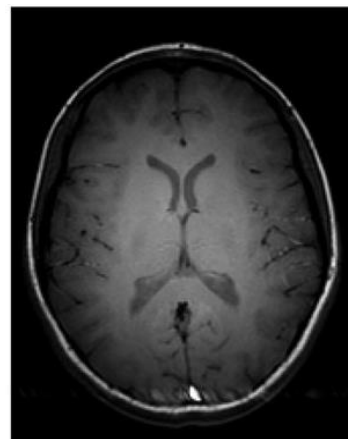
EMI from outside
frequency of FM radio

Solution:

Close the door!

RF shielding

Check the cables



Artifacts (假影)



QA

❖ Motion

Controllable motion (yes/no)

Periodic motion (breath, cardiac pulse, eye movements) causes multiple objects

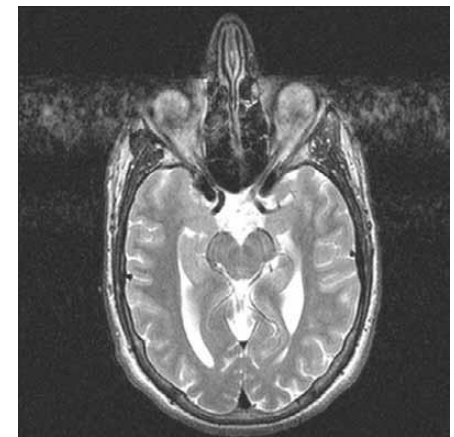
Solution:

Minimize controllable motion

Record periodic motion for correction (e.g. RETROICOR)



Respiration



Eye-movement

Realign-
ment

Slice
timing

Coregist
ration

Normali
zation

Smooth

Segment
ation

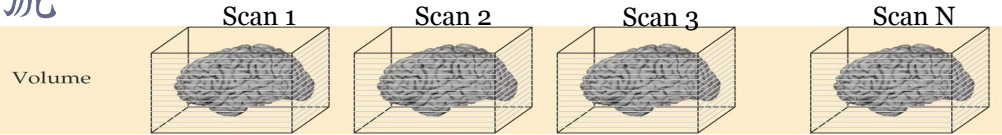
Signal Instability



QA

• fMRI 是動態訊號

- ✓ 重點在時間
- ✓ 時間上的訊息要有足夠的穩定性
- ✓ 可是有的時候連MRI機器本身都不是那麼穩定...



Realign-
ment

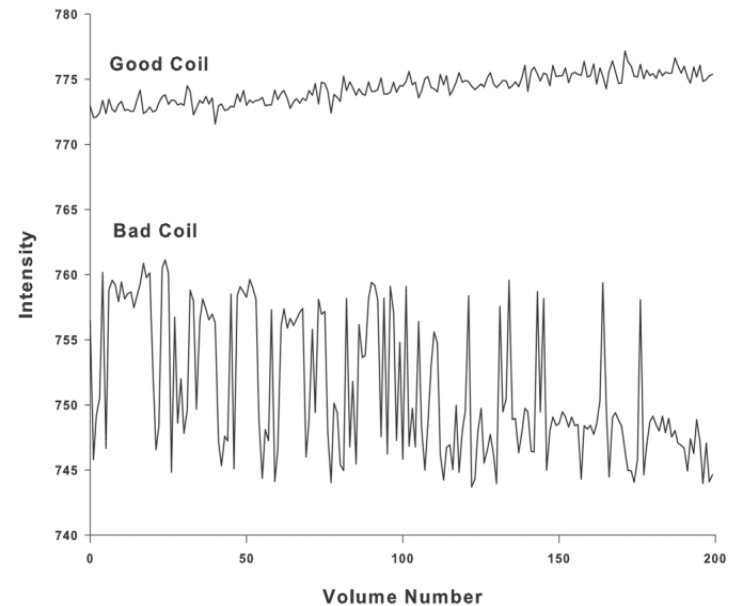
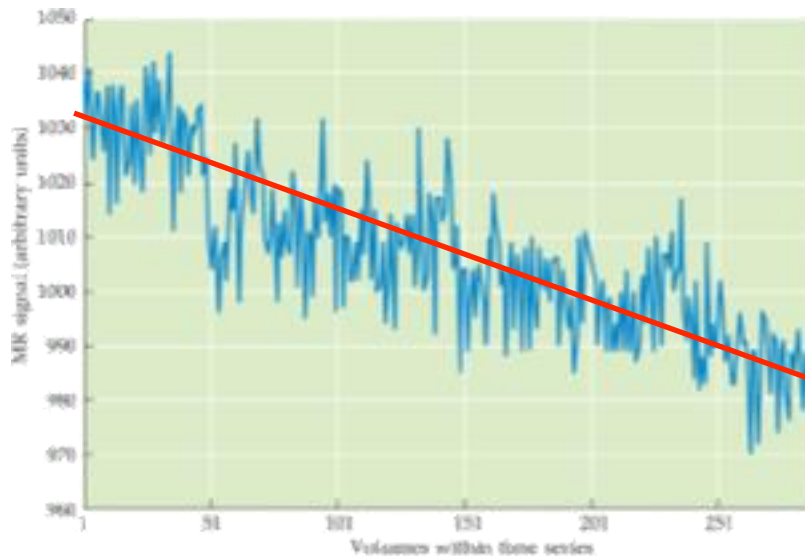
Slice
timing

Coregist
ration

Normali
zation

Smooth

Segment
ation



fMRI stability protocol



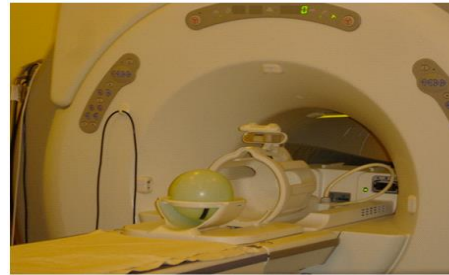
Gary Glover
Stanford Radiology



QA

● 穩定度測試

- Use phantom test
- lasting for 198 time points
- **Drift** (<1%)
- **Fluctuation** (P2P < 1%)



Stanford Criteria
17-cm spherical agar gel.

Realign-
ment

Slice
timing

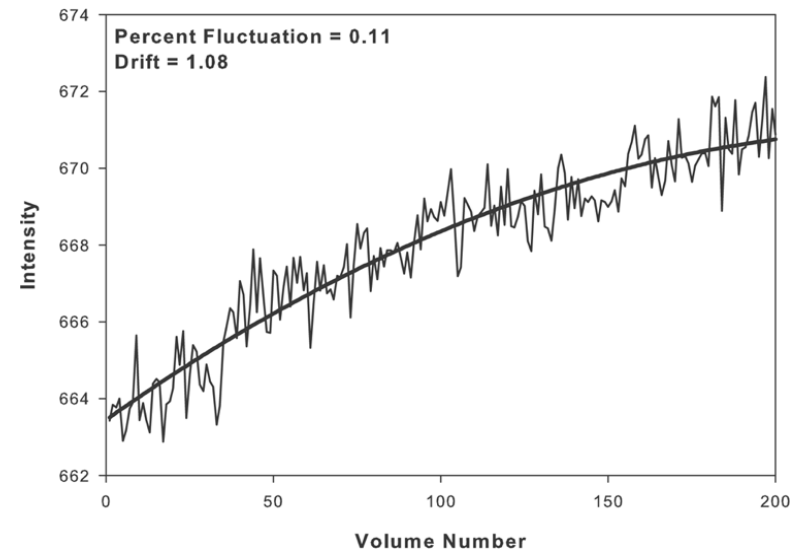
Coregist
ration

Normali
zation

Smooth

Segment
ation

Acquisition type	EPI or spiral gradient echo recalled
Scan plane	Humans: axial oblique (AC-PC line) Phantom: straight axial
Field of view	22 cm
Slices	27, 4-mm-thick, 1-mm interslice gap
TR	2000 msec
TE	30 msec (3 T/4 T), 40 msec (1.5 T)
Flip angle	90 degrees
Bandwidth	$\geq \pm 100$ kHz
Matrix	64 × 64
Number of volumes collected	For QA: 200 + optional warmup volumes
Scan time	6.67 minutes



Signal to Noise Ratio (SNR)



QA

Realign-
ment

Slice
timing

Coregist
ration

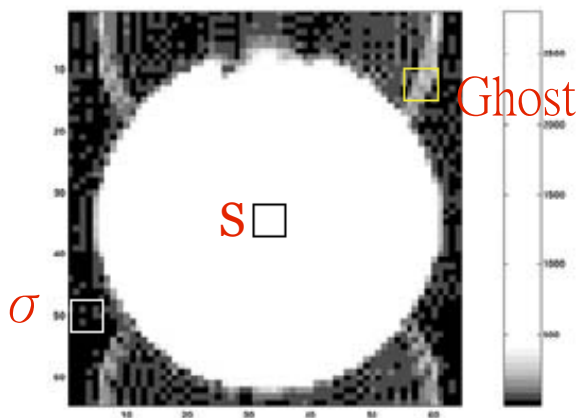
Normali
zation

Smooth

Segment
ation

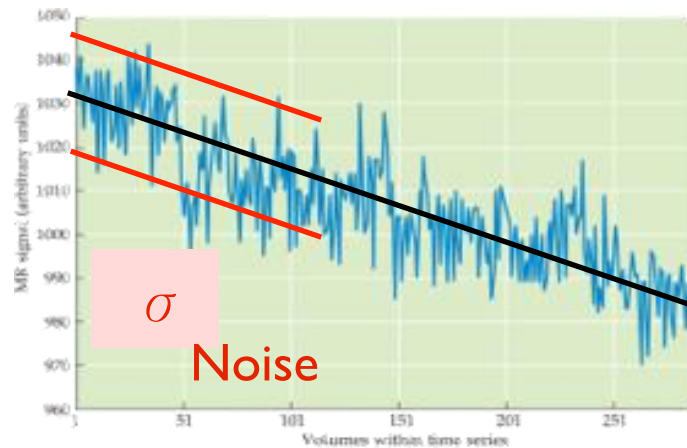
- 2 Types of SNR
 - Spatial SNR (MRI)
 - Temporal SNR (fMRI)

Spatial SNR



$SNR_0=115$, $SGR=33$ ($3 \times 3 \times 6$ mm³)

Temporal SNR



$SNR=51.5$, $p2p=4.3\%$

信雜比 $SNR = \frac{S}{\sigma}$ 影像強度
雜訊

Stimulation devices



QA

Realign-
ment

Slice
timing

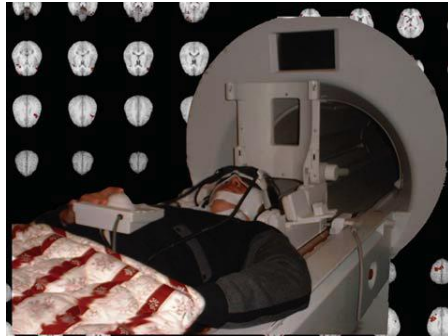
Coregistra-
tion

Normali-
zation

Smooth

Segmenta-
tion

- fMRI 要進行很多刺激呈現



- 要用MRI相容系統(很貴!)

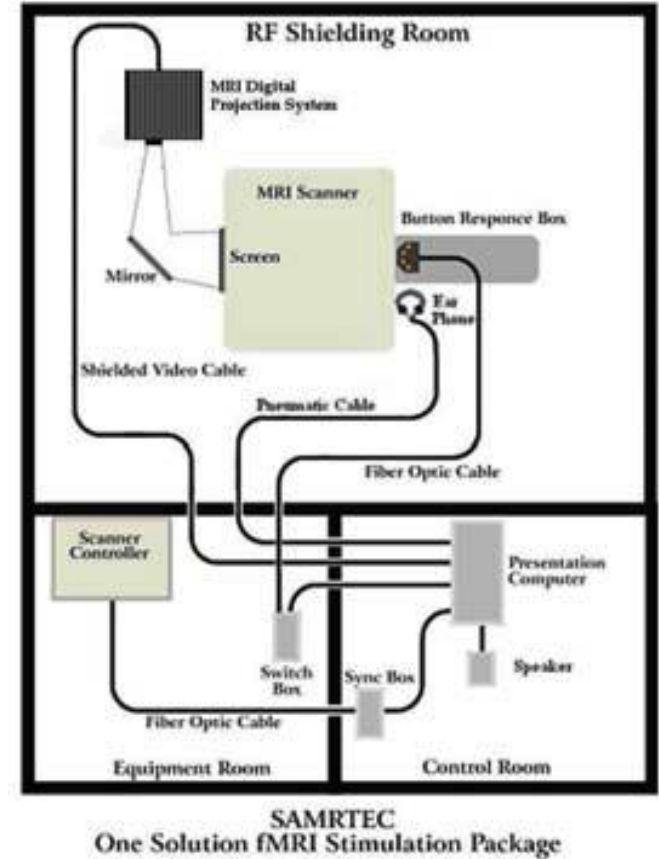
Projector, goggle, eye tracker

Headset, Response pad, physiological monitor

要用光纖或透過屏蔽板連接

- 但是...

它們會不會對fMRI影像信號產生干擾?



Stimulation devices



QA

Realign-
ment

Slice
timing

Coregist
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Normali
zation

Smooth

Segment
ation

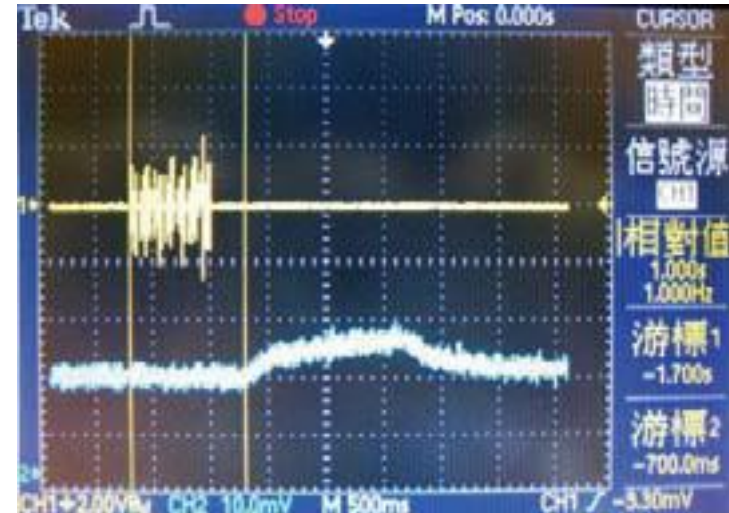
- 配戴 fMRI 週邊設備進行掃描有可能產生信號延遲或影像假影



- 視覺刺激：
信號反應是否即時？顯示畫面對比與亮度是否符合需求？是否會在影像上產生假影？



- 聽覺刺激：
聲音信號反應是否即時？頻率是否受到影響？



Ex. The computer delivers a 1-s delay between 700-ms auditory and 1000-ms visual stimuli.

Stimulation devices



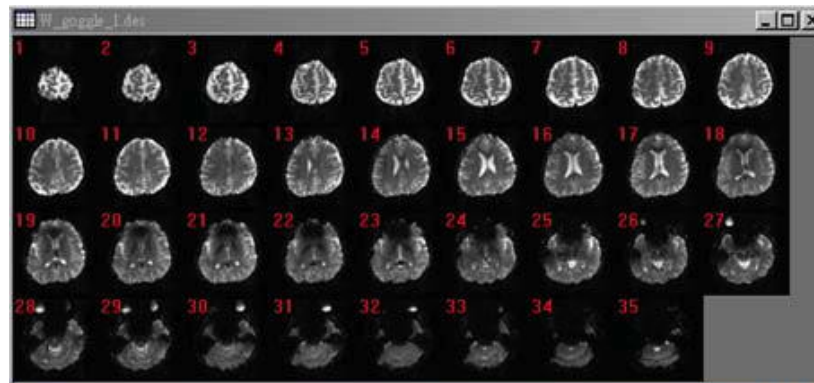
- with goggle vs. without goggle

整體SNR下降

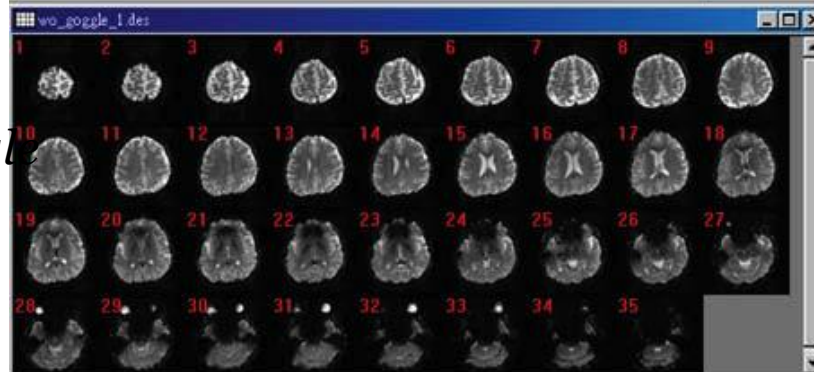
局部區位產生假影 (要注意!)



with goggle
 $SNR=279.4$



without goggle
 $SNR=371.4$



QA

Realign-
ment

Slice
timing

Coregist
ration

Normali
zation

Smooth

Segment
ation

Stimulation devices



QA

Realign-
ment

Slice
timing

Coregist
ration

Normali
zation

Smooth

Segment
ation

- with headset vs. without headset

整體SNR下降

局部區位產生假影 (要注意!)

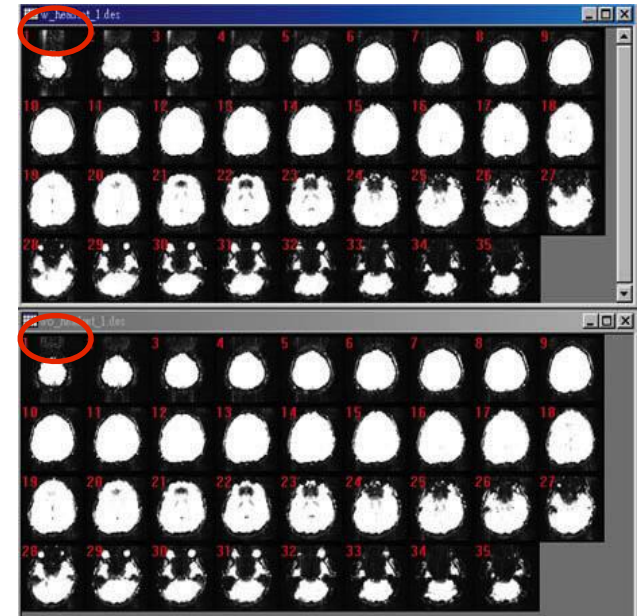
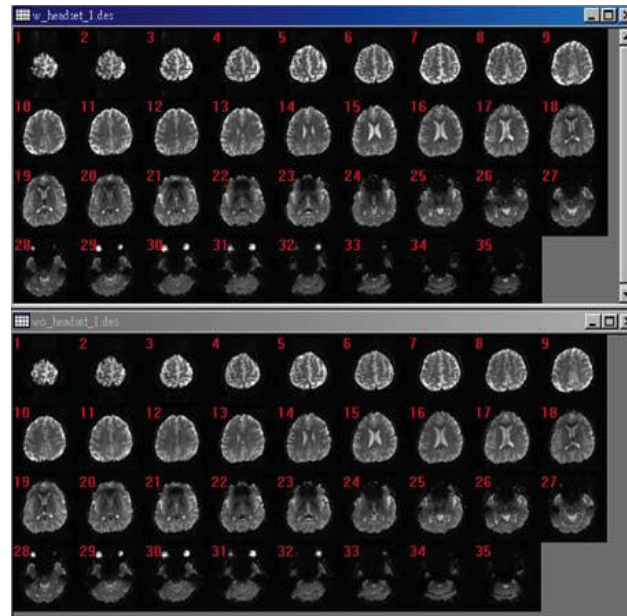
image



noise

with headset
 $SNR=208.4$

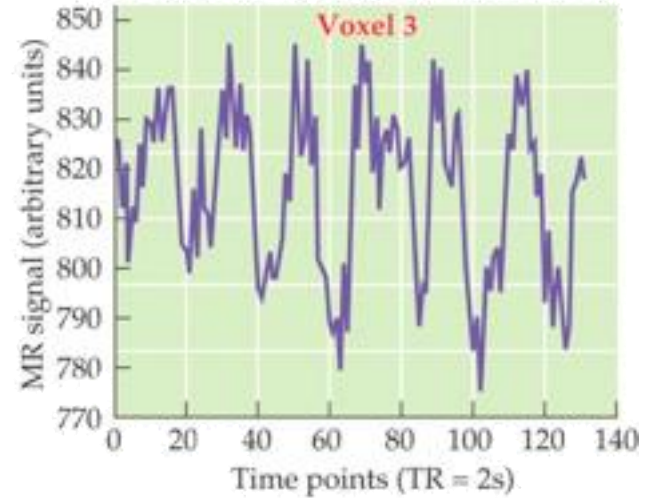
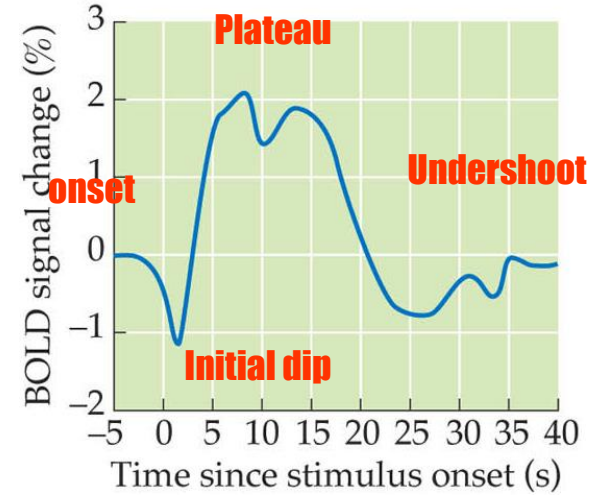
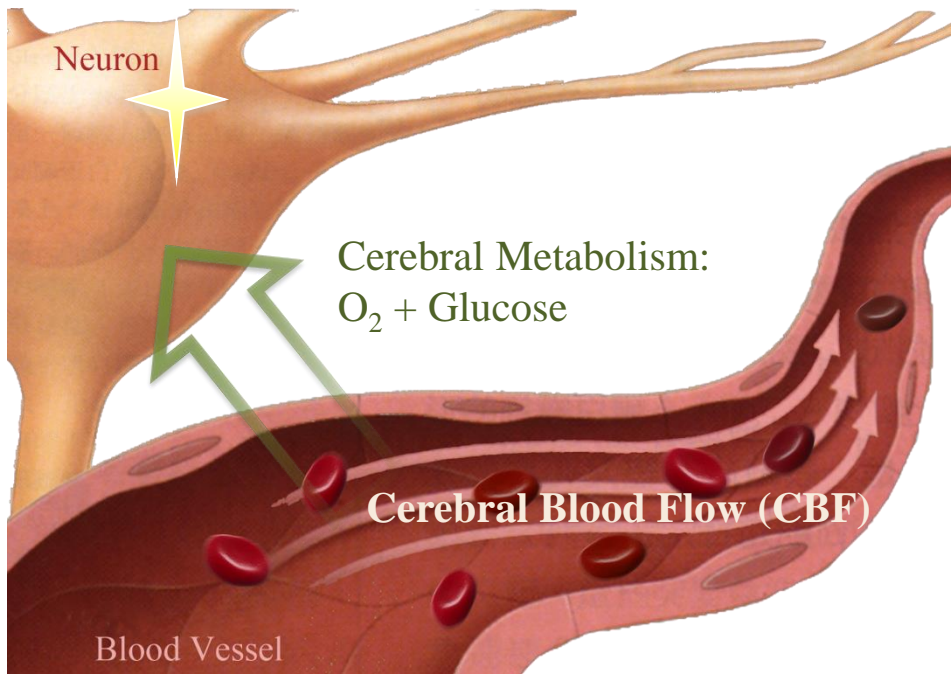
w/o headset
 $SNR=235.3$



Functional contrast-to-noise ratio (CNR)



- QA
- Realignment
- Slice timing
- Coregistration
- Normalization
- Smooth
- Segmentation



Functional contrast-to-noise ratio (CNR)



QA

Realign-
ment

Slice
timing

Coregist
ration

Normali
zation

Smooth

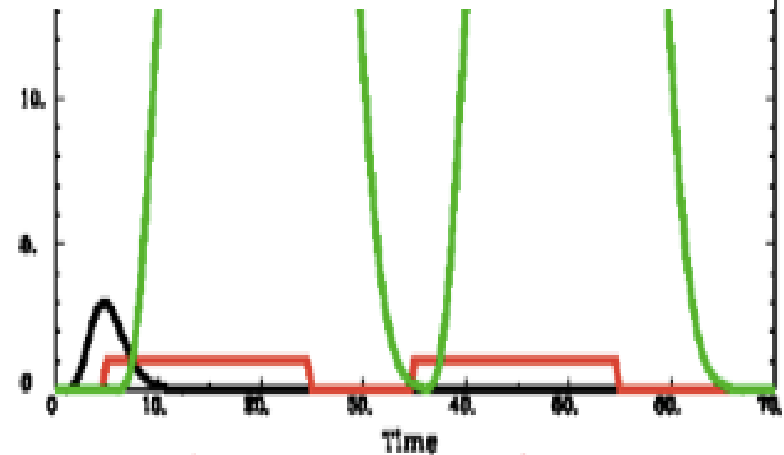
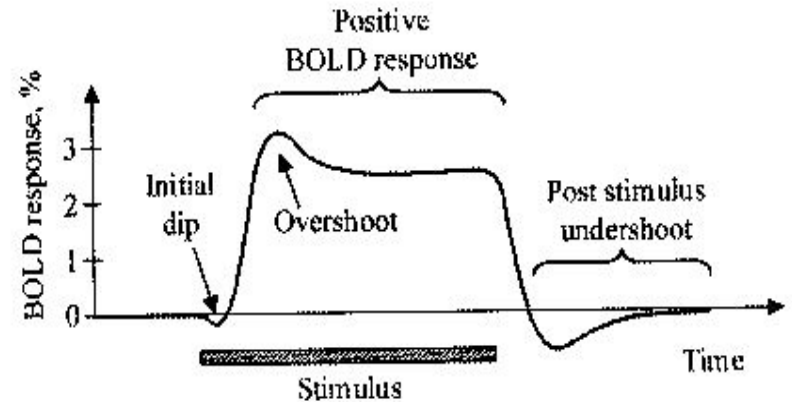
Segment
ation

● Ideal response of fMRI signal to single stimulus

- Delay: 1-2 sec
- Rise time: 4-5 sec
- Fall time: 4-6 sec

● Convolution with design

- $r(t) = h(t) \otimes d(t)$
- Linearity assumption
 - Not precisely correct!



Functional contrast-to-noise ratio (CNR)

QA

Realign-
ment

Slice
timing

Coregist
ration

Normali
zation

Smooth

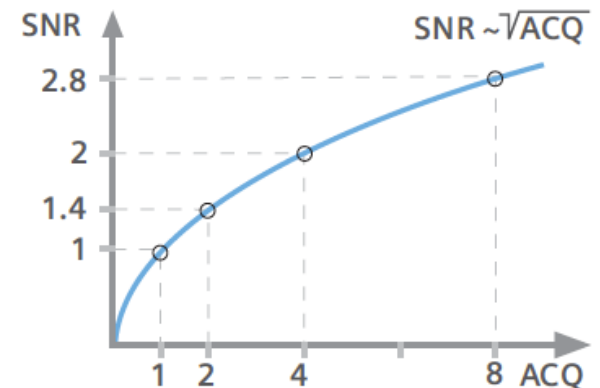
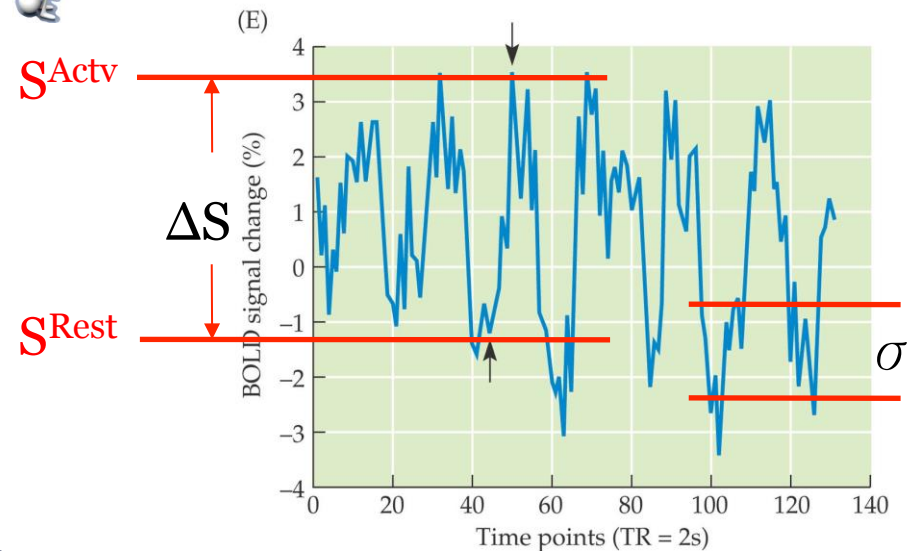
Segment
ation

❖ Signal Change (SC)

$$\frac{\Delta S}{S} = \frac{S^{Actv} - S^{Rest}}{S^{Rest}}$$

❖ Signal-to-Noise Ratio (SNR)

$$SNR = \frac{S^{Rest}}{\sqrt{\sigma_T^2 + \sigma_P^2}}$$



Functional contrast-to-noise ratio (CNR)



QA

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ment

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timing

Coregist
ration

Normali
zation

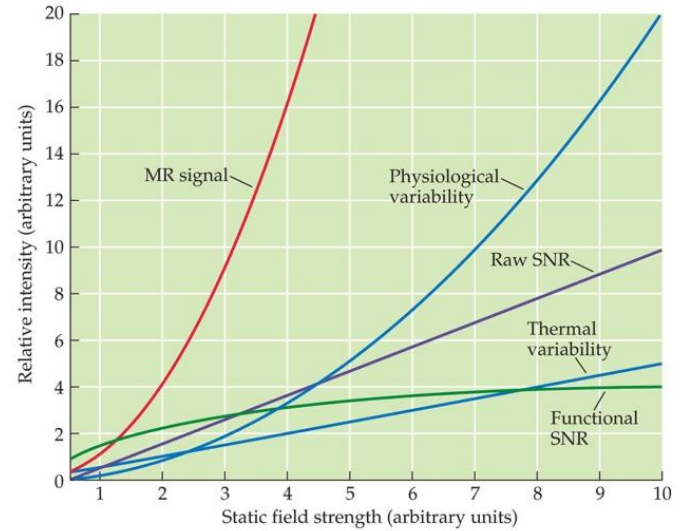
Smooth

Segment
ation

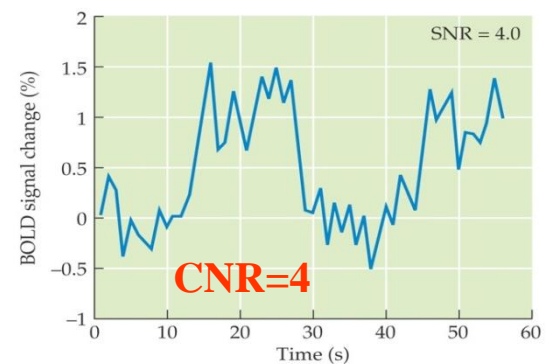
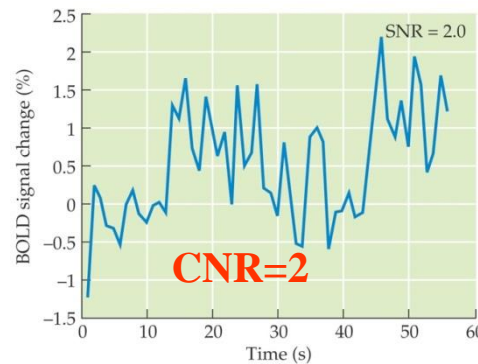
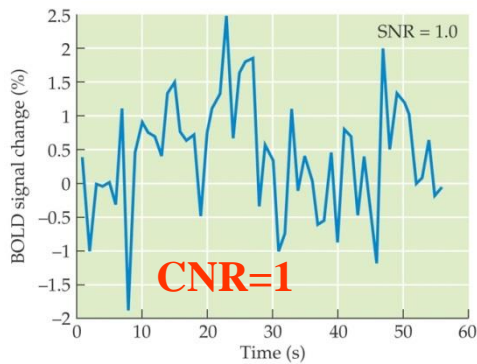
❖ Contrast-to-Noise Ratio (CNR) or *Functional SNR*

$$CNR = SC \times SNR = \frac{\Delta S}{\sigma}$$

2% 100



FUNCTIONAL MAGNETIC RESONANCE IMAGING, Figure 9.13 © 2004 Sinauer Associates, Inc.



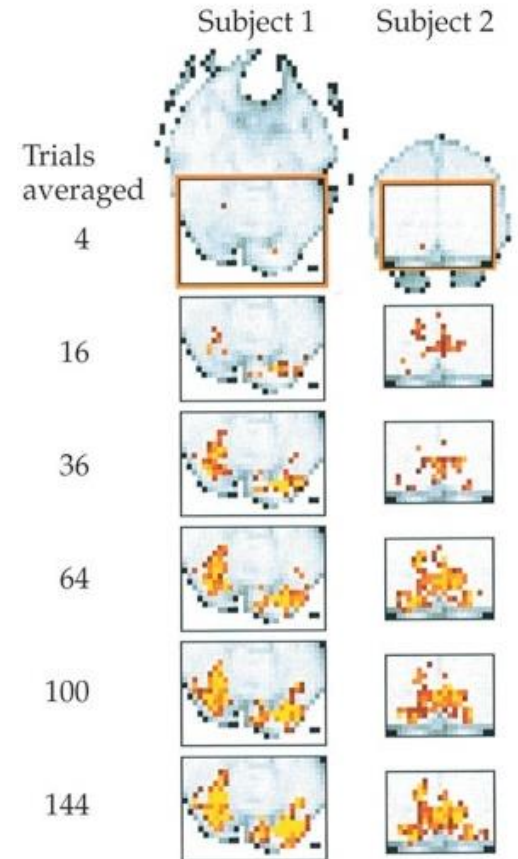
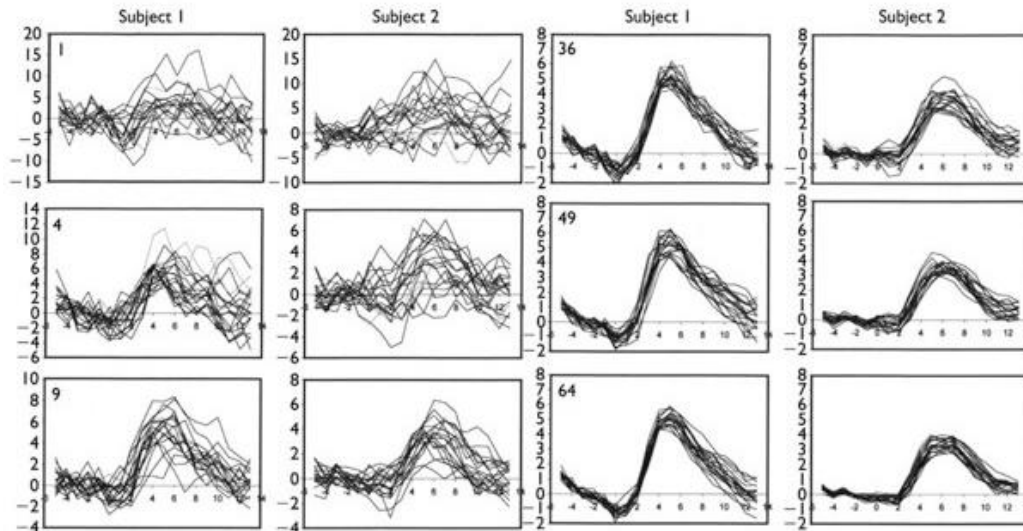
Increasing functional CNR



QA

❖ Trial Number ↑

Trade-off: ACQ time & Task effect



Realign-
ment

Slice
timing

Coregist
ration

Normali
zation

Smooth

Segment
ation

Increasing functional CNR



QA

Realign-
ment

Slice
timing

Coregistra-
tion

Normali-
zation

Smooth

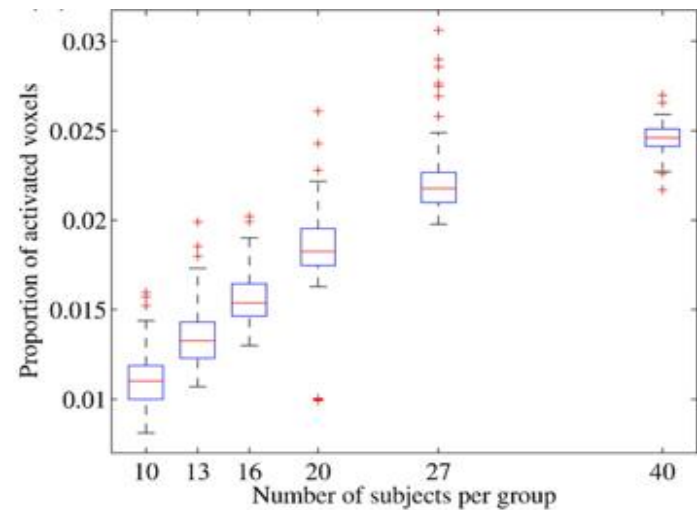
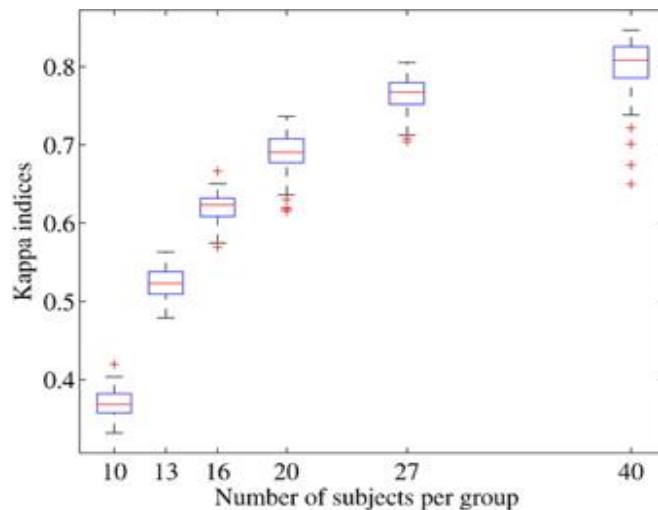
Segmenta-
tion

❖ Subject Number ↑

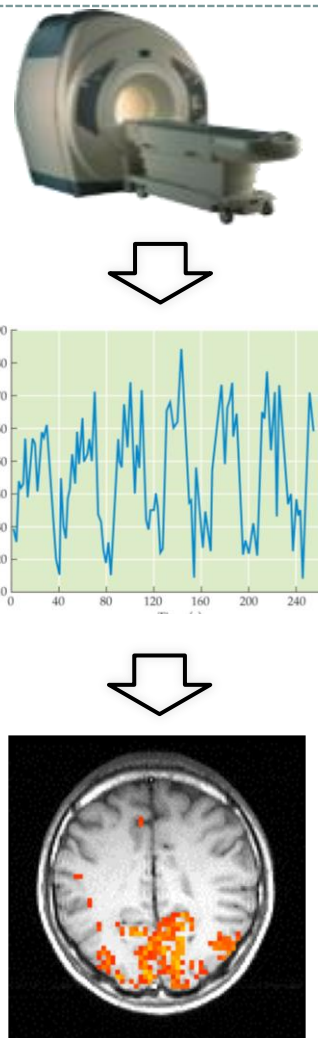
For reliability, $N=20$ is a minimum requirements.

Preferably, $N > 27$

Based on *auditory & motor* activity!



fMRI PreProcessing



Experimental Design

Image Acquisition

Quality Assurance

Preprocessing

Before we can really get the fancy results...

SPM procedure

The screenshot shows the SPM software interface for spatial pre-processing. It includes several buttons: 'Realign (...)', 'Coregiste...', 'Slice timing', 'Normalis...', 'Smooth', and 'Segment'. The 'Spatial pre-processing' tab is selected.

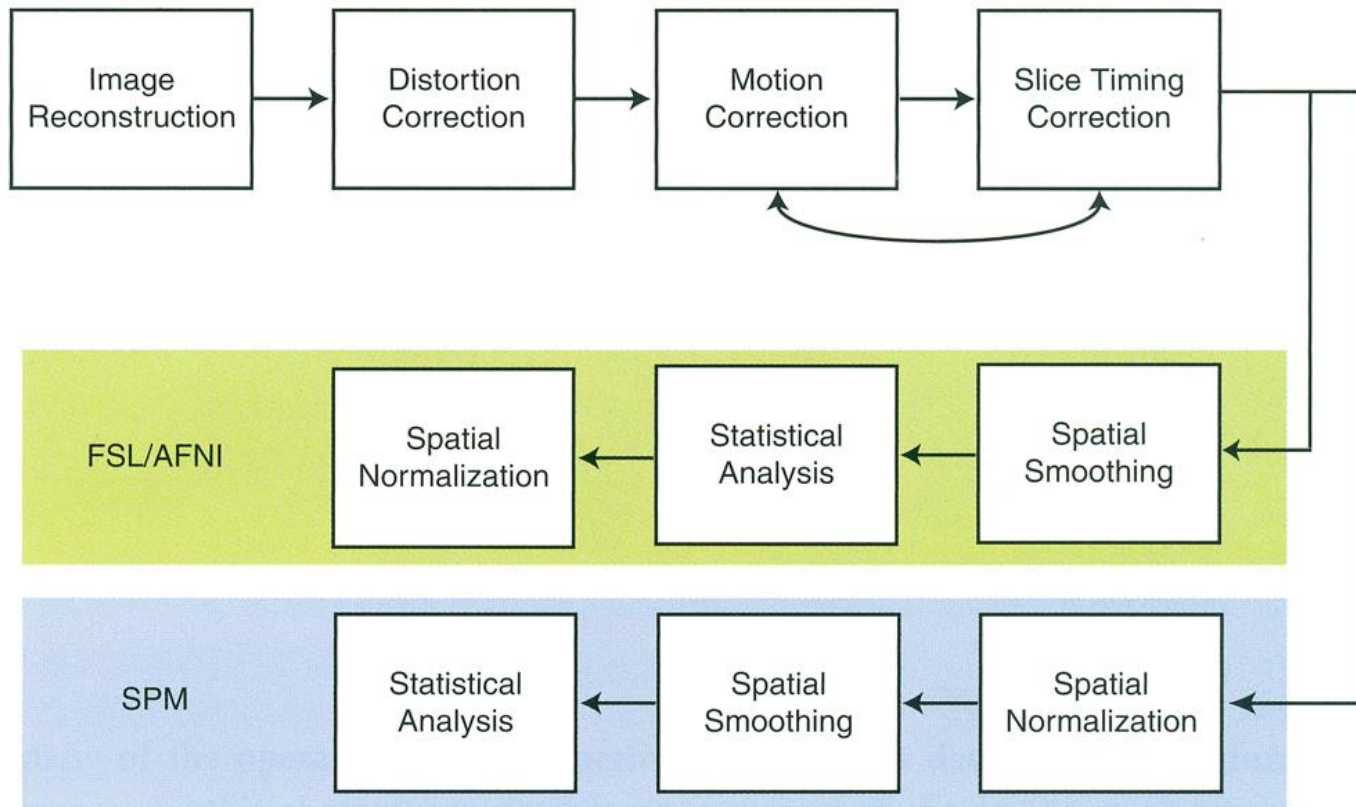
Statistical Tests

1st-level t-test/correlation/regression (GLM)

Group Analysis

2nd-level analysis

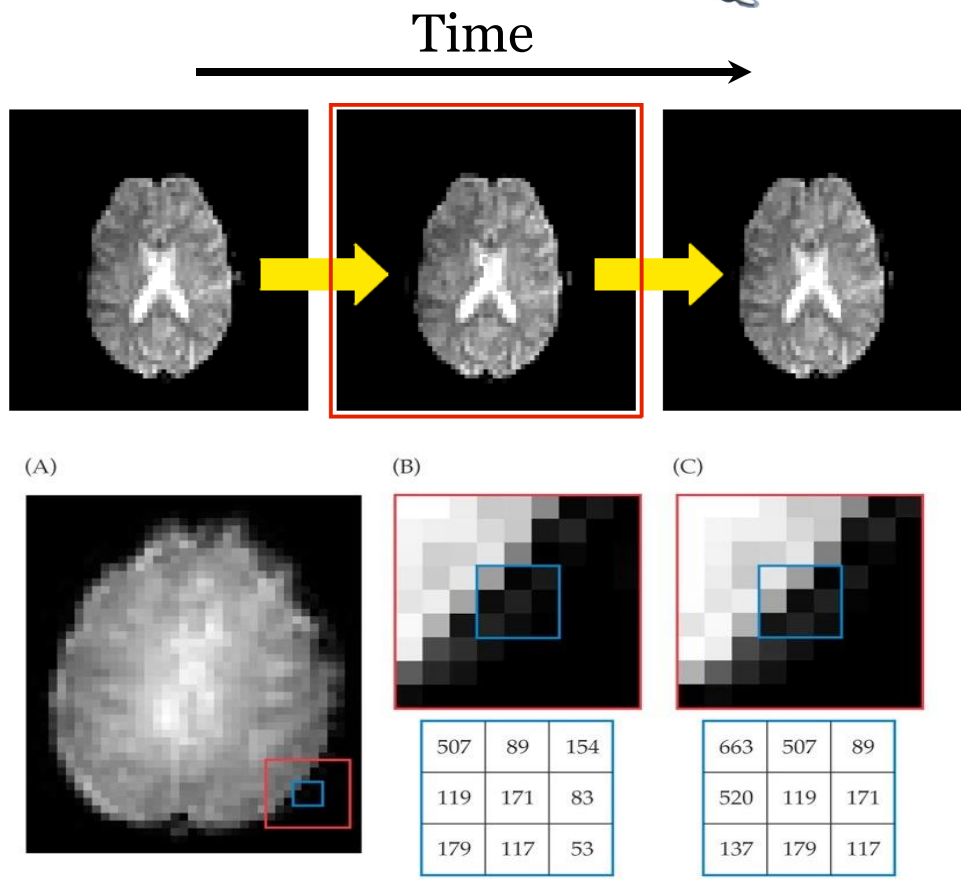
Preprocessing Procedures



Motion Correction



- QA
- Realign-
ment
- Slice timing
- Coregistration
- Normali-
zation
- Smooth
- Segment-
ation



- ❖ People do move in MRI
- ❖ General assumption:
 - each voxel should be located at the same point in acquisition.

▸ **even w/ padding, slight motion is possible!**

$$\Delta S = (663 - 507) / 507 = 30\%$$

Motion Correction



QA

Realign-
ment

Slice
timing

Coregistra-
tion

Normali-
zation

Smooth

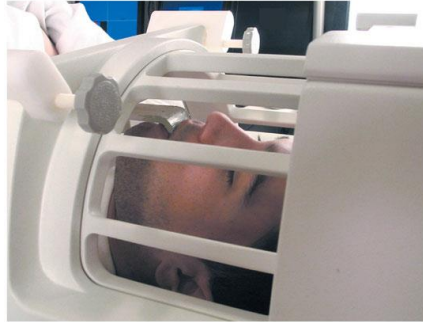
Segmenta-
tion

(A)



FUNCTIONAL MAGNETIC RESONANCE IMAGING 3e, Figure 8.20 (Part 1)
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(B)



FUNCTIONAL MAGNETIC RESONANCE IMAGING 3e, Figure 8.20 (Part 2)
© 2014 Elsevier Associates, Inc.

(C)



FUNCTIONAL MAGNETIC RESONANCE IMAGING 3e, Figure 8.20 (Part 3)
© 2014 Elsevier Associates, Inc.

(D)



FUNCTIONAL MAGNETIC RESONANCE IMAGING 3e, Figure 8.20 (Part 4)
© 2014 Elsevier Associates, Inc.

- ❖ **Motion** causes strong artifacts in MRI!
- ❖ Even worse in fMRI
 - ~ 1-mm motion may cause 30% signal change >> BOLD signal!
- ❖ **Mandatory immobilization!**

Motion Correction



QA

Realign-
ment

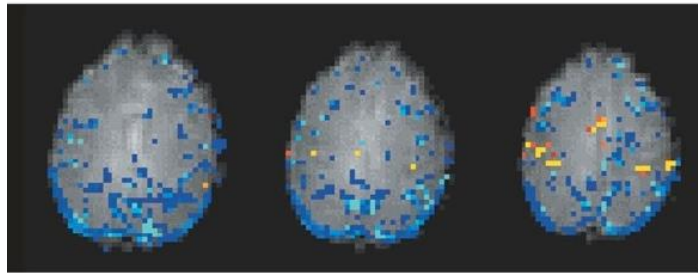
Slice
timing

Coregist
ration

Normali
zation

Smooth

Segment
ation



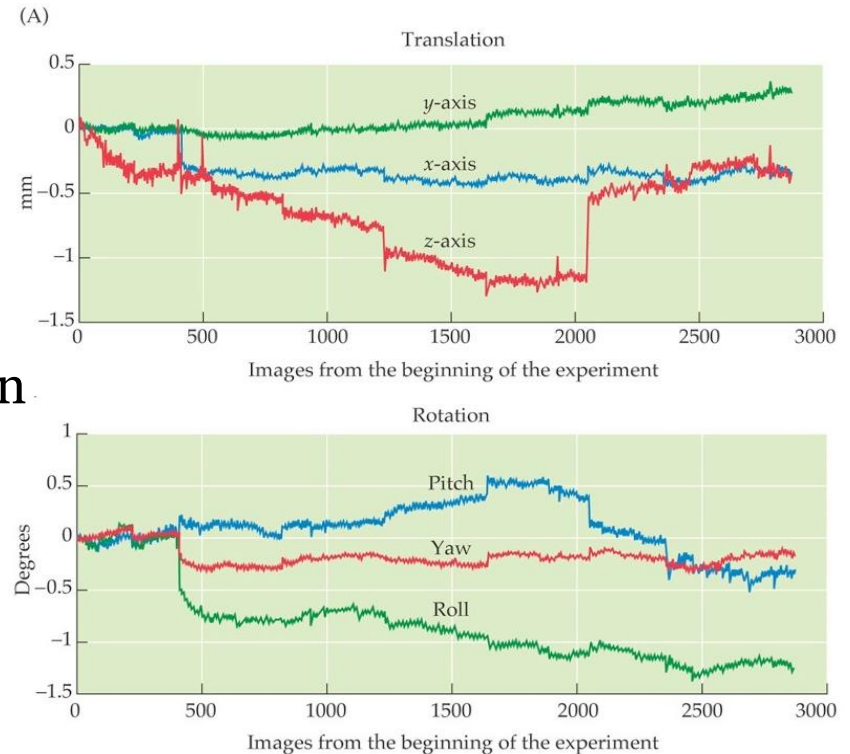
❖ Solution:

❖ Realign to a **common reference** (you pick one)

❖ **Rigid-body transformation**
(3 translations + 3 rotations)

❖ Estimate / Write (SPM)
‣ check if correction is good enough.

← If you don't do motion correction, esp. for task-related motion



Motion Correction



QA

Realign-
ment

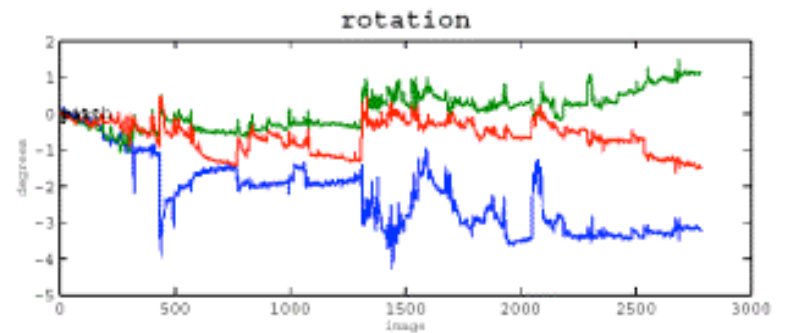
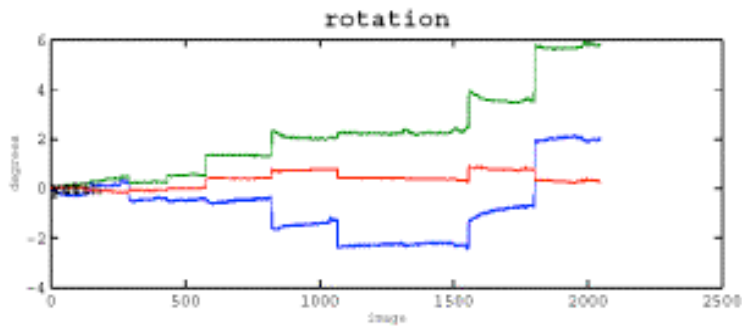
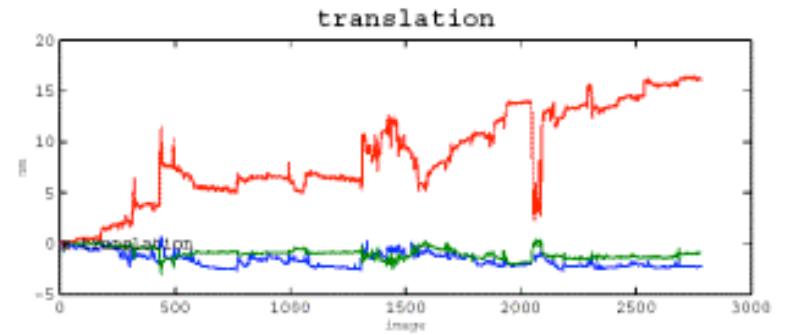
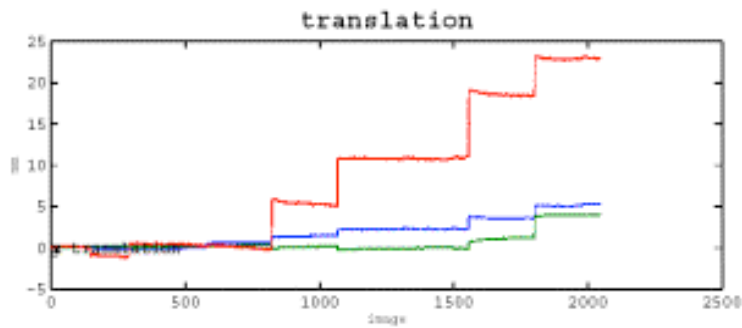
Slice
timing

Coregis-
tration

Normali-
zation

Smooth

Segment-
ation



Catastrophe...

Motion Correction



QA

Realign-
ment

Slice
timing

Coregist
ration

Normali
zation

Smooth

Segment
ation

masking were disabled. The statistical analysis model included covariates for the global CBF variation and translational motion of the head. Extracerebral voxels were masked and statistical parametric maps (SPM's) were computed. First, the periods without penile stimulation were divided into periods when penile erection was present (Post-Stimulation) or when the penis was flaccid (Flaccid), defined as $<10\%$ of the maximum penile circumference. Average translational scan-to-scan movement was in the sub-millimeter range, average rotational scan-to-scan movement was less than 3 degrees in most subjects and always less than 6 degrees. Greater head motion was often recorded at the transition between the stimulation and non-stimulation periods. Five perfusion images (representing 33 s) were separately modeled and excluded from the analyses to remove confounding head motion at the time of maximum arousal and ejaculation. Comparisons were made between the Stimulation and

Slice timing correction



QA

Realign-
ment

Slice
timing

Coregist-
ration

Normali-
zation

Smooth

Segment-
ation

○ Interleaved

✓ 1-3-5-2-4

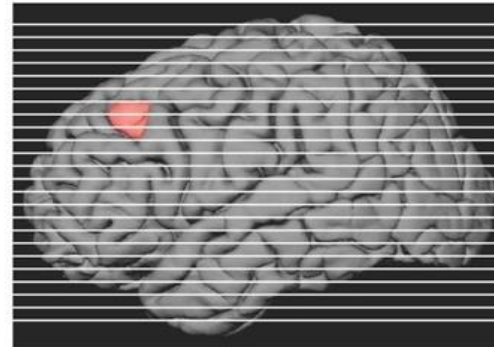
for less RF cross-talk

○ *Problem:*

Adjacent slices are acquired at
half-TR-away in timing

Error in timing estimation!

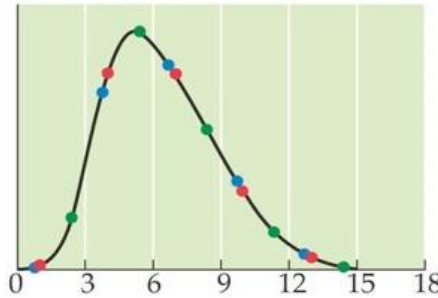
(A)



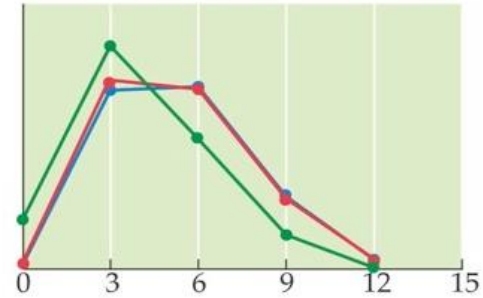
(B)



(C)



(D)



Slice timing correction



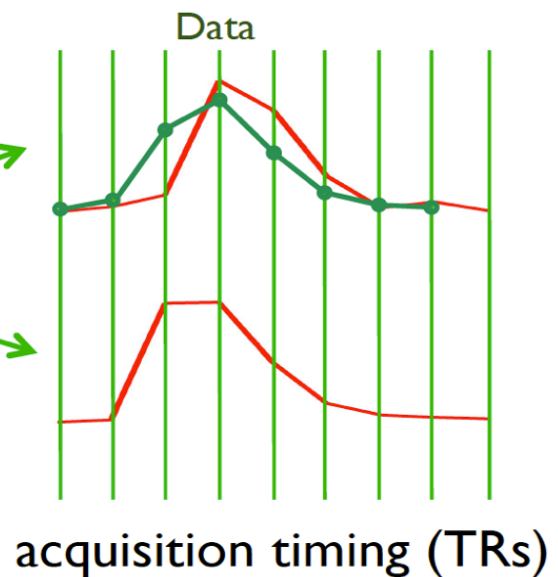
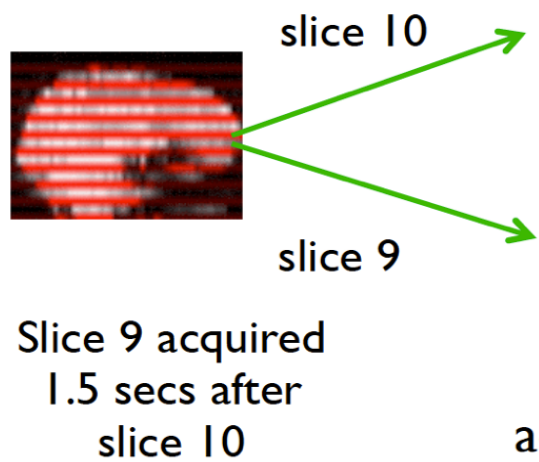
Problem:

- Adjacent slices are acquired at half-TR-away in timing

Solution:

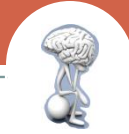
- shifting the time delay
- interpolation

especially significant in **Event-related** design



- QA
- Realignment
- Slice timing**
- Coregistration
- Normalization
- Smooth
- Segmentation

Coregistration



QA

Realign-
ment

Slice
timing

Coregistration

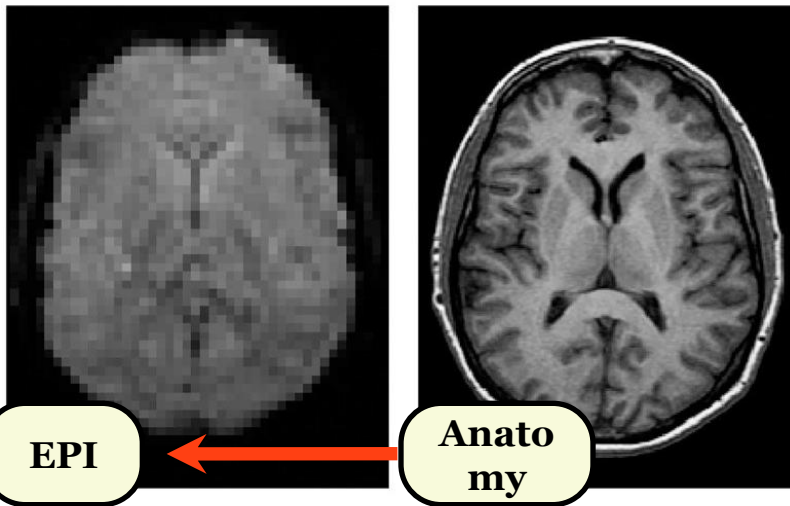
Normali-
zation

Smooth

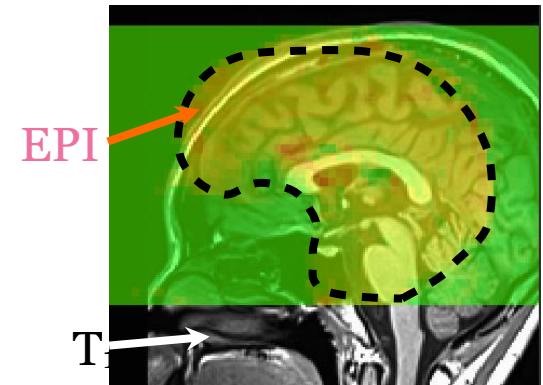
Segment-
ation

❖ **Anatomical image (T₁w)** should match **EPI images**

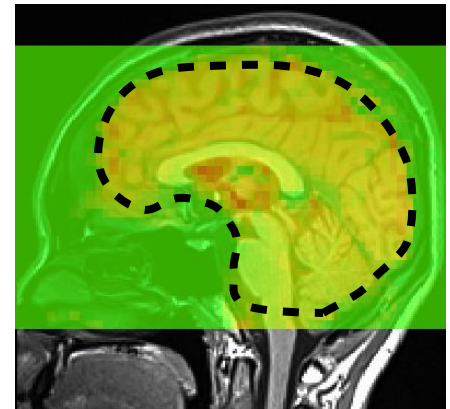
‣ T₁w → EPI



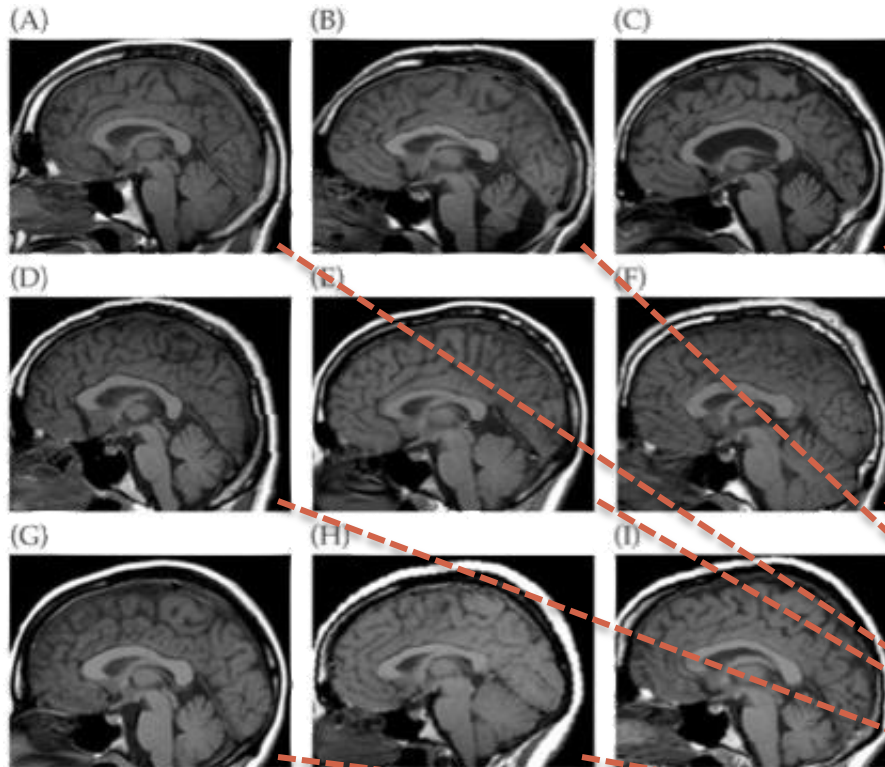
Un-registered



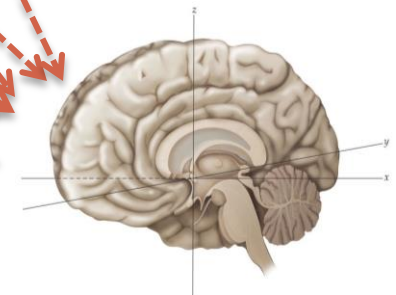
Coregistered



Normalization



- ❖ Everybody has different kinds of brain shape.
- ❖ To conduct Group Analysis, individual has to be transformed into a **template** (standard) **space**.



QA

Realign-
ment

Slice
timing

Coregist
ration

**Normali
zation**

Smooth

Segment
ation

Normalization: templates



QA

❖ **Standard Templates**

Realign-
ment

✓ **Talairach**

single French subject

Slice
timing

✓ **Montreal Neurological Institute (MNI)**

152 normal westerns

<http://www.bic.mni.mcgill.ca/>

Coregist-
ration

**Normali-
zation**

✓ **International Consortium for Brain Mapping (ICBM)**

452 normal westerns

<http://www.loni.ucla.edu/>

Smooth

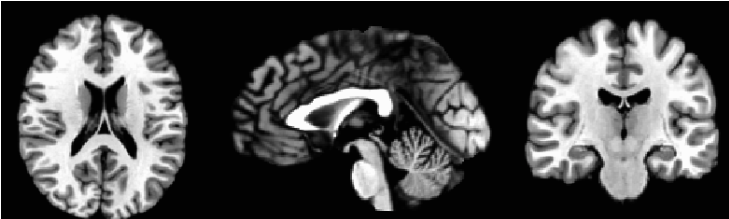
Segment-
ation

✓ **Asian templates**

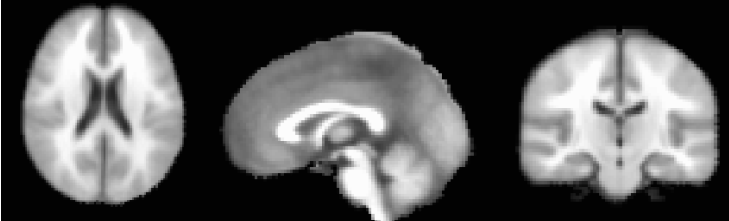
NTU

Singapore

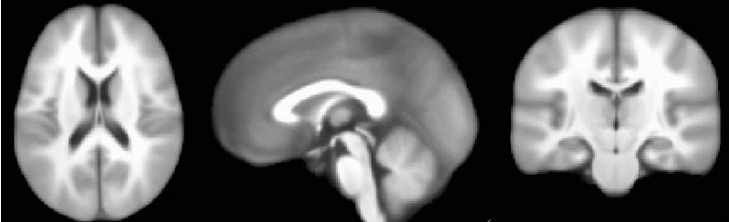
Talairach



MNI



ICBM

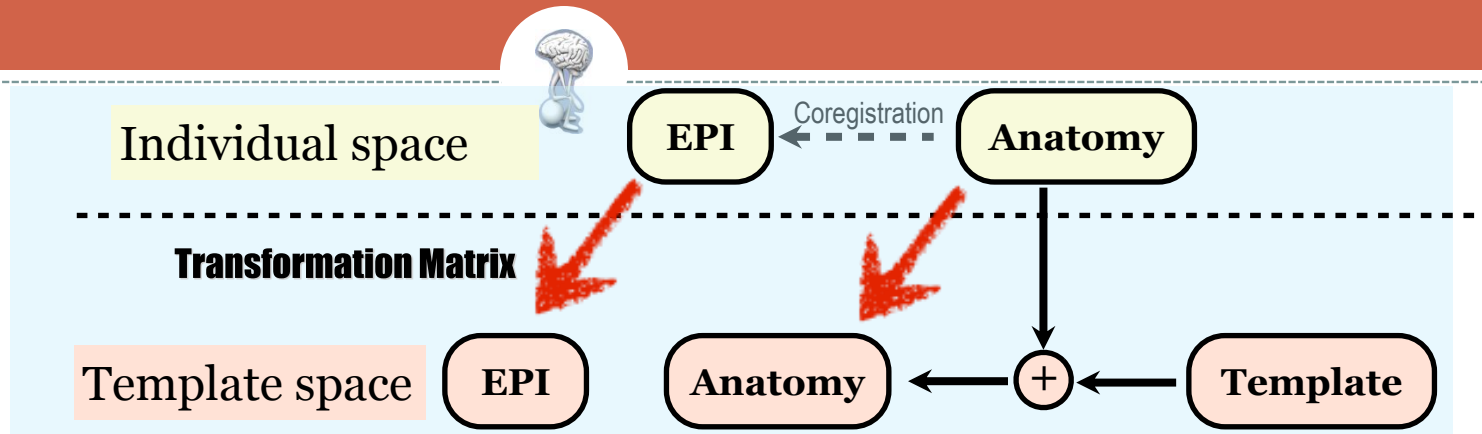


MNI to Talairach Conversion (Yale University)

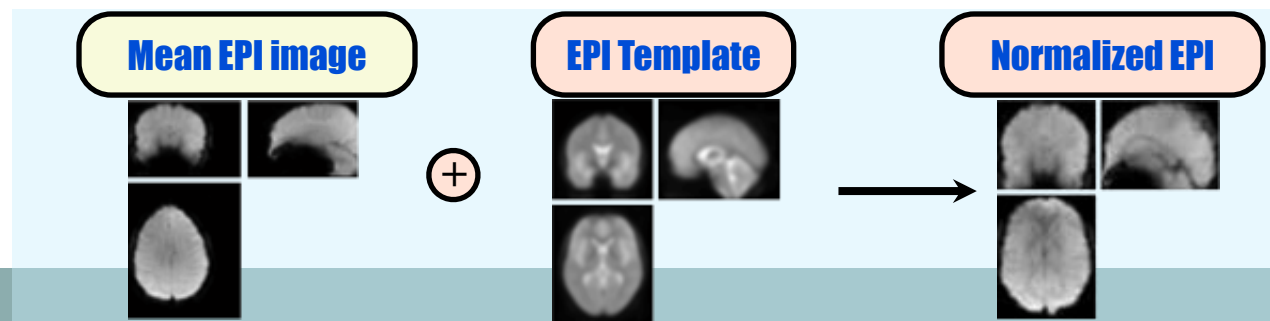
<http://www.bioimagesuite.org/Mni2Tal/index.html>

Normalization

- QA
- Realignment
- Slice timing
- Coregistration
- Normalization**
- Smooth
- Segmentation



- ❖ For correcting brain disparity b/w subjects
- ❖ Affine (rigid body) transformation
 - Estimate: form **Transformation Matrix**
 - Write: apply TM to functional data



Spatial Smoothing



QA

Realign-
ment

Slice
timing

Coregist
ration

Normali
zation

Smooth

Segment
ation

- ❖ Apply a 3D convolution with a Gaussian kernel

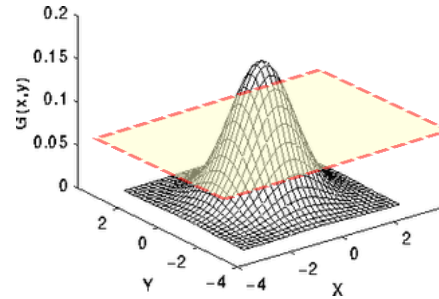
Full-width-half maximum (FWHM)

$$FWHM = 2\sigma \sqrt{2 \ln(2)}$$

1. To increase SNR
2. To reduce stat. comparison

- Remove noise (small activations)
- Blurring (reduce spatial resolution)

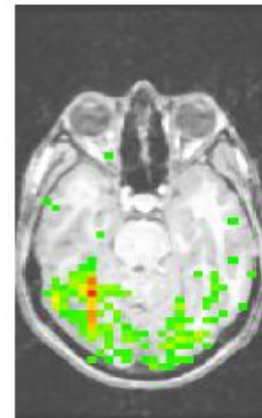
Optimal size of Smooth:
~1.5x original voxel size



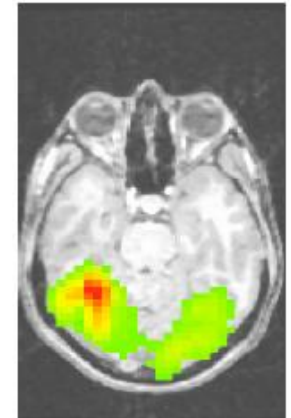
Weights

0.1	0.3	0.4	0.3	0.1
0.3	0.6	0.8	0.6	0.3
0.4	0.8	1.0	0.8	0.4
0.3	0.6	0.8	0.6	0.3
0.1	0.3	0.4	0.3	0.1

↔
FWHM



**Original
unsmoothed data**



**Smoothed data
(FWHM = 8mm)**

Spatial Smoothing



QA

Realign-
ment

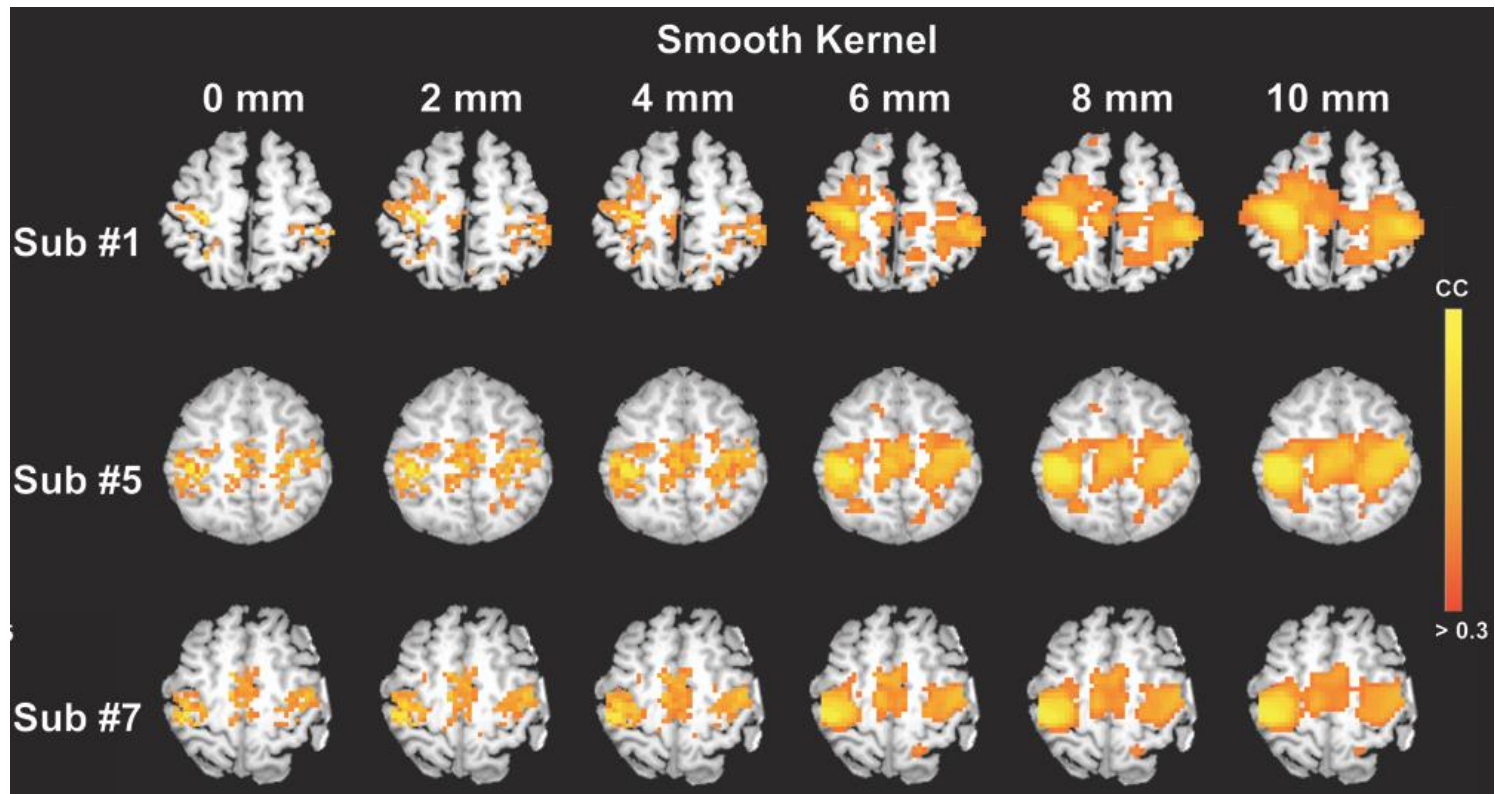
Slice
timing

Coregist
ration

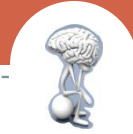
Normali
zation

Smooth

Segment
ation



Temporal Filtering



QA

Realign-
ment

Slice
timing

Coregist
ration

Normali
zation

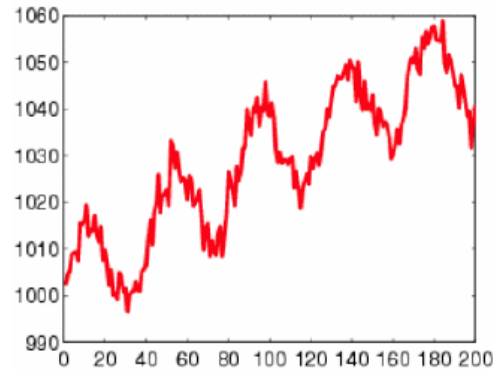
Smooth

Segment
ation

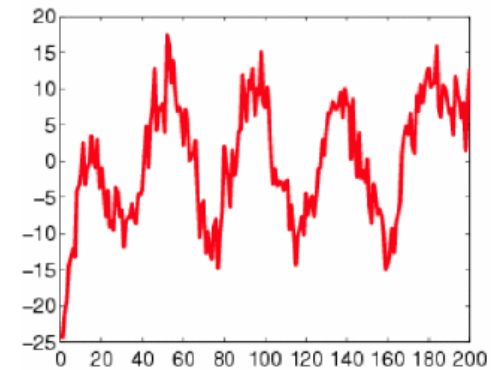
- ❖ High-pass filter
 - remove linear trend

- ❖ Low-pass filter
 - smoothing signal

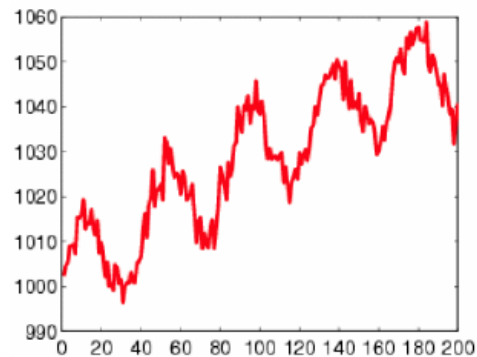
Raw Signal



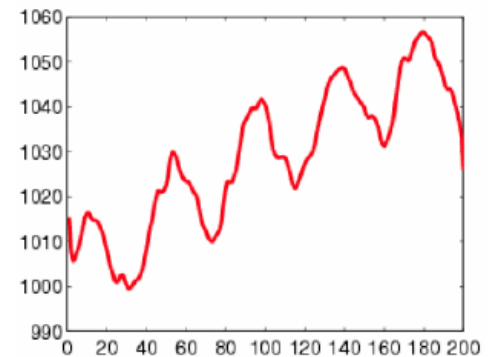
Highpass Filtered



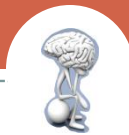
Raw Signal



Lowpass Filtered



Temporal Filtering



QA

Realign-
ment

Slice
timing

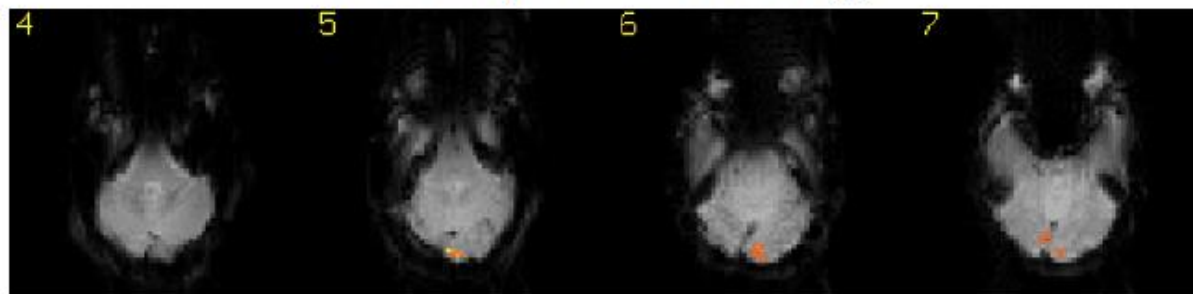
Coregist
ration

Normali
zation

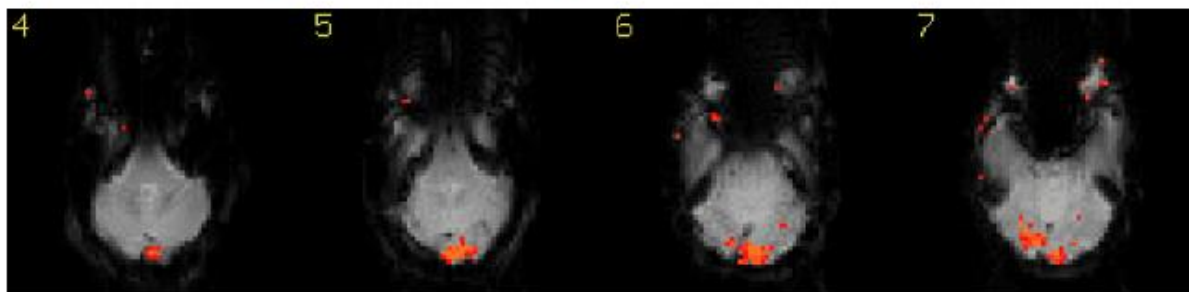
Smooth

Segment
ation

No Temporal Filtering

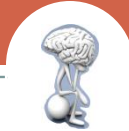


Highpass Temporal Filtering



□ Don't remove the task frequency!

Segmentation



QA

Realignment

Slice timing

Coregistration

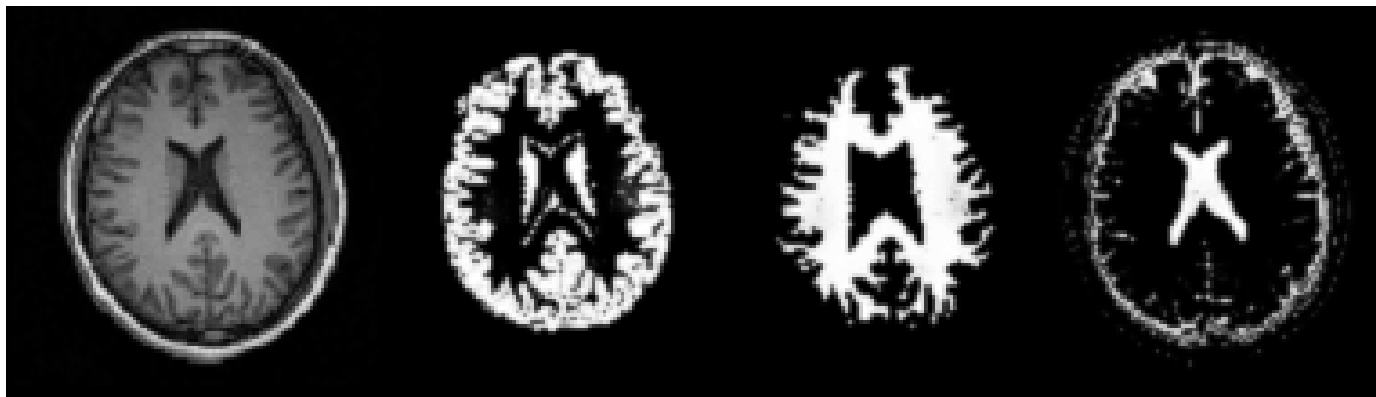
Normalization

Smooth

Segmentation

- ❖ Classifies different **anatomical divisions** in the brain
- ❖ Not related to functional data, but useful to generate masks for global covariates. (for resting-state fMRI)

Anatomy Gray matter White matter CSF



Take Home Message I



- Acquired MR images may contain several **artifacts**

Worst case: throw away garbage datasets.

Doesn't matter, summon **EE/medical physics** experts

Take Home Message II



- **Preprocessing summary**

(no necessary to include them all):

Slice-Timing Correction	Get consistent acquisition timing
Motion Correction (Realignment)	Get consistent anatomical coordinates
Coregistration (EPI - T1)	Get consistent anatomy btw Anat. & Func.
Normalization	Get consistent anatomy btw subjects
Spatial smoothing	Reduce σ_T and Increase power
Temporal filtering	Reduce physiological noise σ_P in frequency