

# Multi-modal imaging: simultaneous EEG-fMRI

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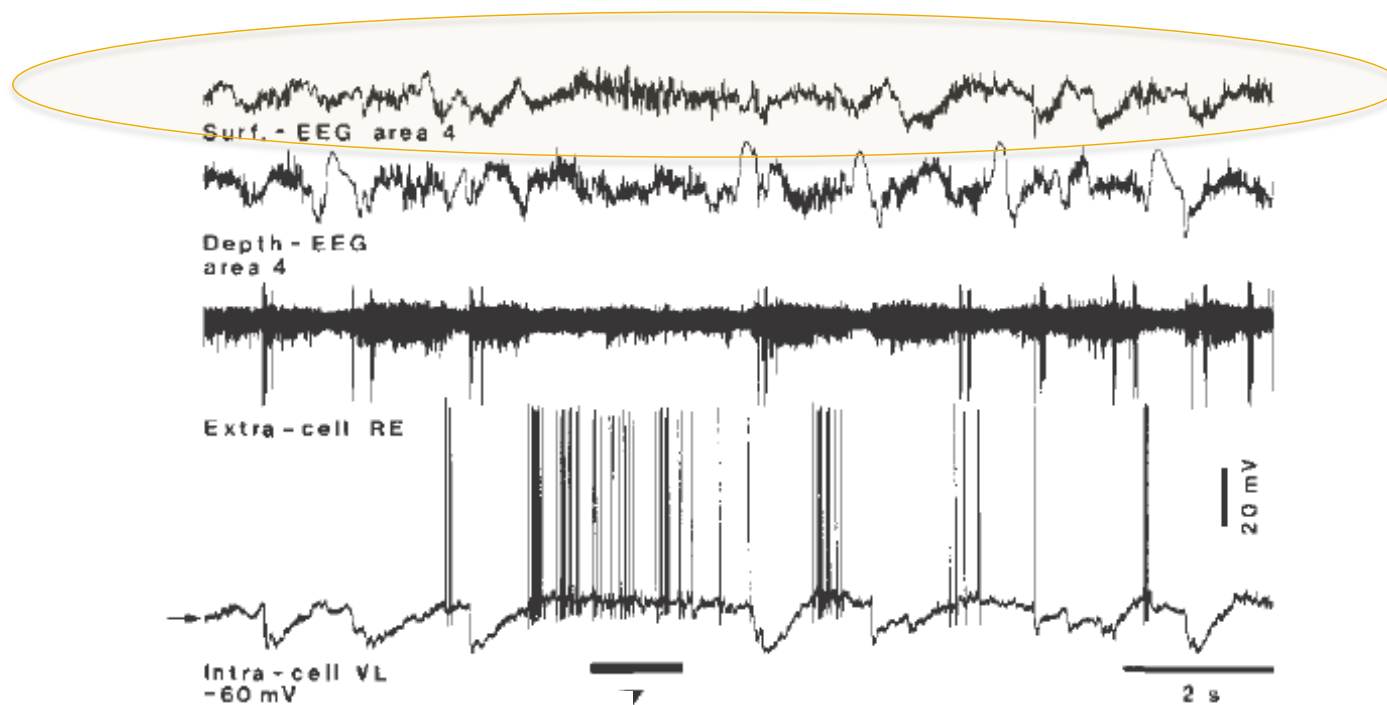


# Outline

- EEG overview
- Why simultaneous EEG-fMRI?
- How? Technical considerations
- When? Examples

# EEG (electroencephalography)

measure of synchronous activity of population of neurons, primarily reflects postsynaptic potentials.

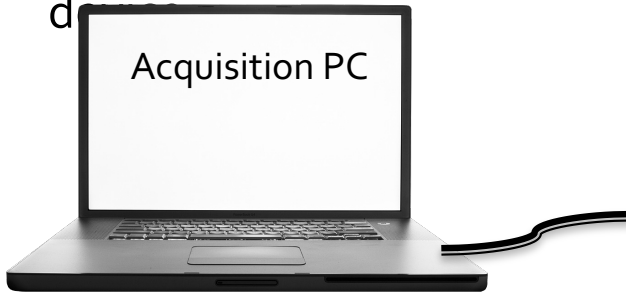


# EEG measures

recording

d

Acquisition PC

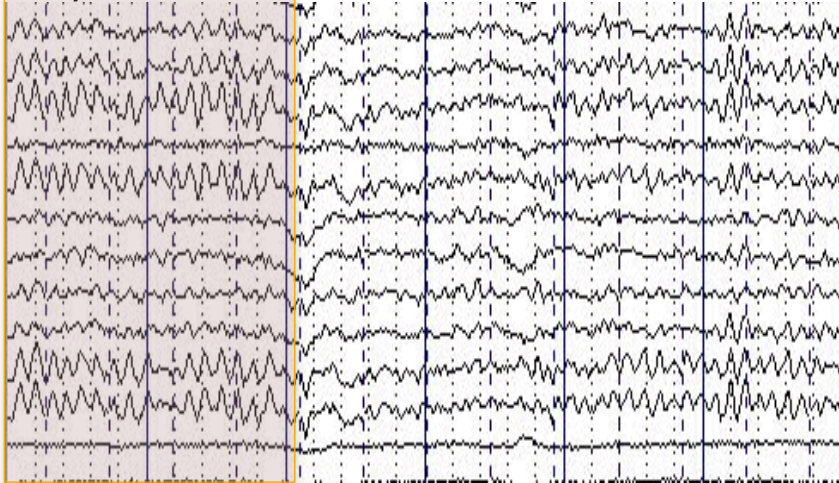


Isolated amplifiers  
filters  
A/D converter



Electrodes and  
conductive media

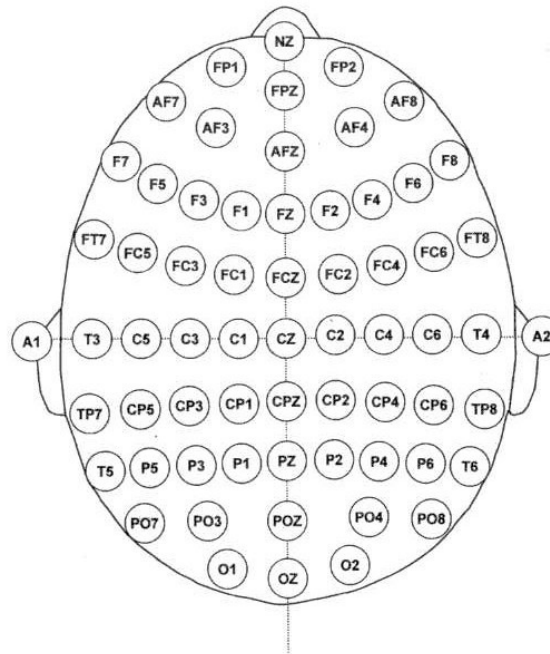
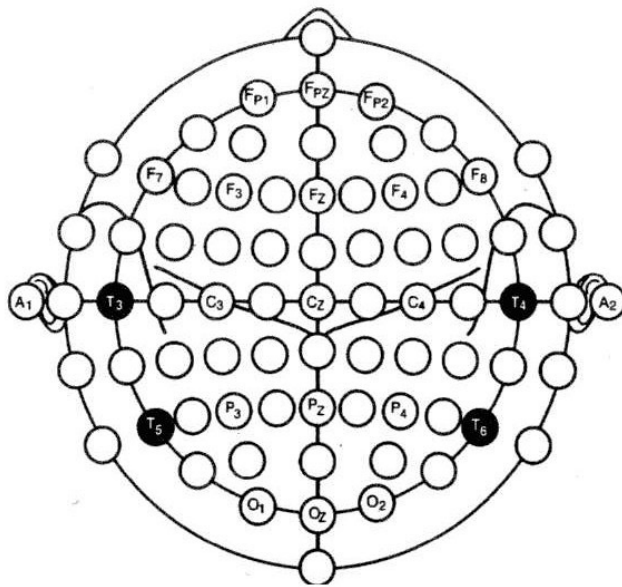
Eyes closed



1 S



# montage



## Electrode configuration

- Referential
  - ( $S_i$  vs. Ref;  $S_k$  vs. Ref)
- Bipolar
  - ( $S_i$  vs..  $S_k$ )

## International 10-20 System of Electrode Placement

F - Frontal lobe      T - Temporal lobe

C - Central lobe      P - Parietal lobe

O - Occipital lobe

"Z" refers to an electrode placed on the mid-line.

Odd: left

Even: right

# Data processing

- Time domain
  - Event Related Potentials (ERPs)

pre-processing:

detrend - filtering

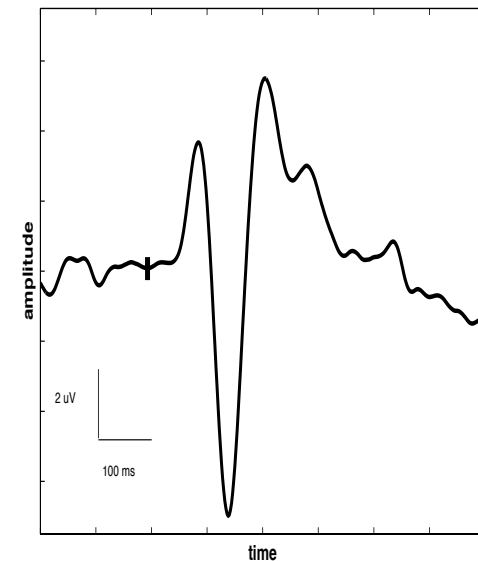
epoch

baseline correction

ocular artifact reduction

(common grounded, artifact rejection)

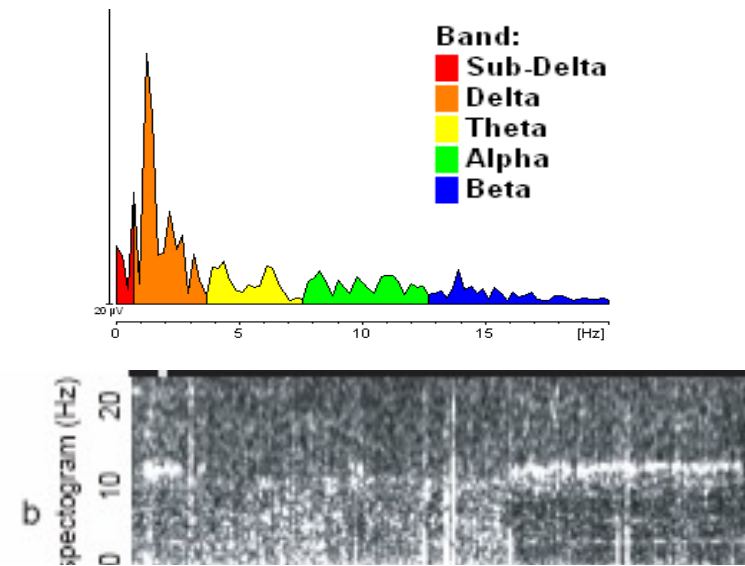
time-locked averaging



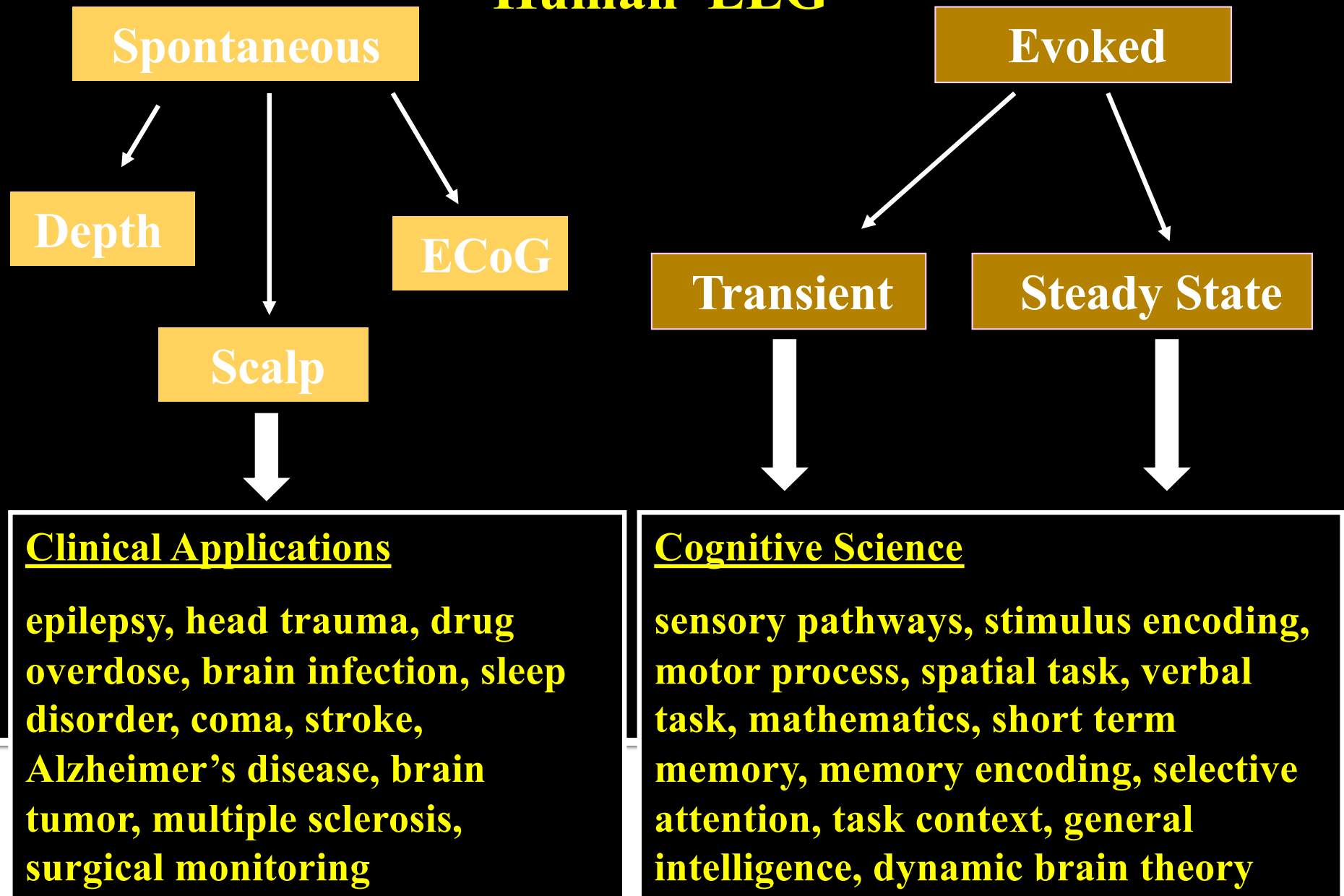
# Data processing

- Frequency domain

- Power at different bands
- Power spectra density (FFT)
- Cross-spectra  
(correlation among different electrodes)
- Coherence  
(measure of stability of the phase shift between electrodes)
- Event related desynchronization



# Human EEG

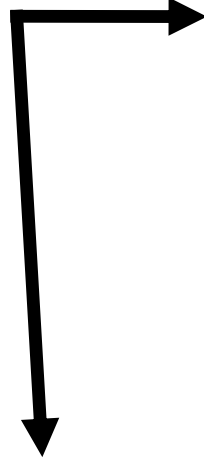


**Why do we want to measure EEG  
and fMRI simultaneously?**

# Neuroimaging

**BRAIN ACTIVITY**

$$f(x,t)$$



**electrical  
EEG, MEG**  
 $m[f(x,t)]$

**Good time resolution (ms)**

**Poor spatial resolution**

**Metabolic/  
vascular  
responses**  
 $g[f(x,t)]$

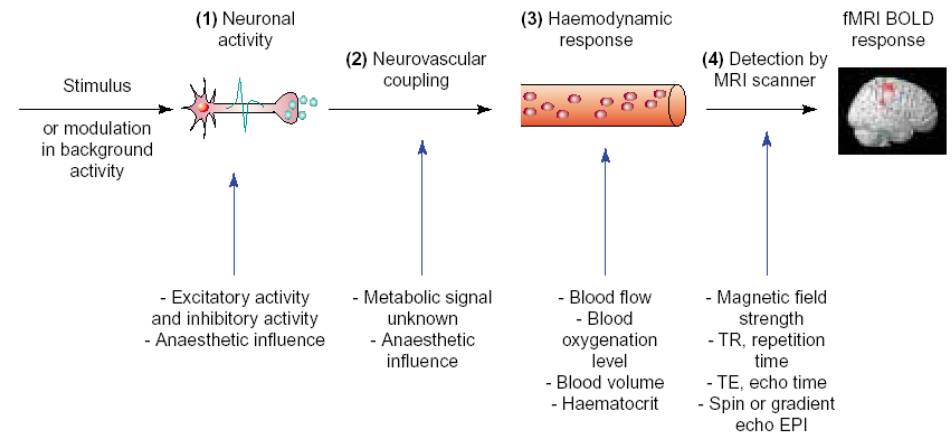
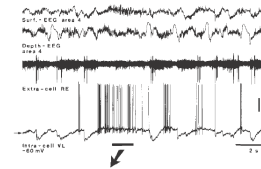


**fMRI**

$$k\{g[f(x,t)]\}$$

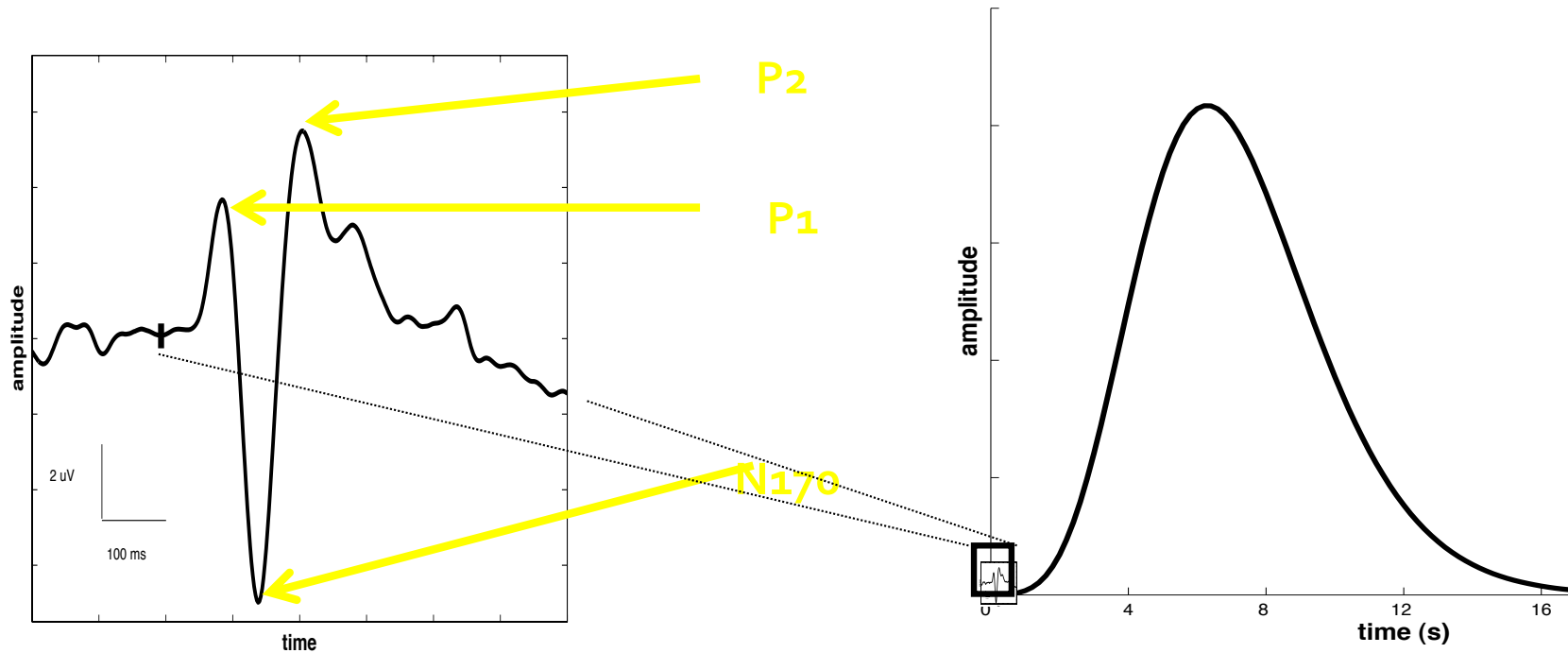
**Poor time resolution (s)**

**Good spatial resolution (mm)**



# EEG

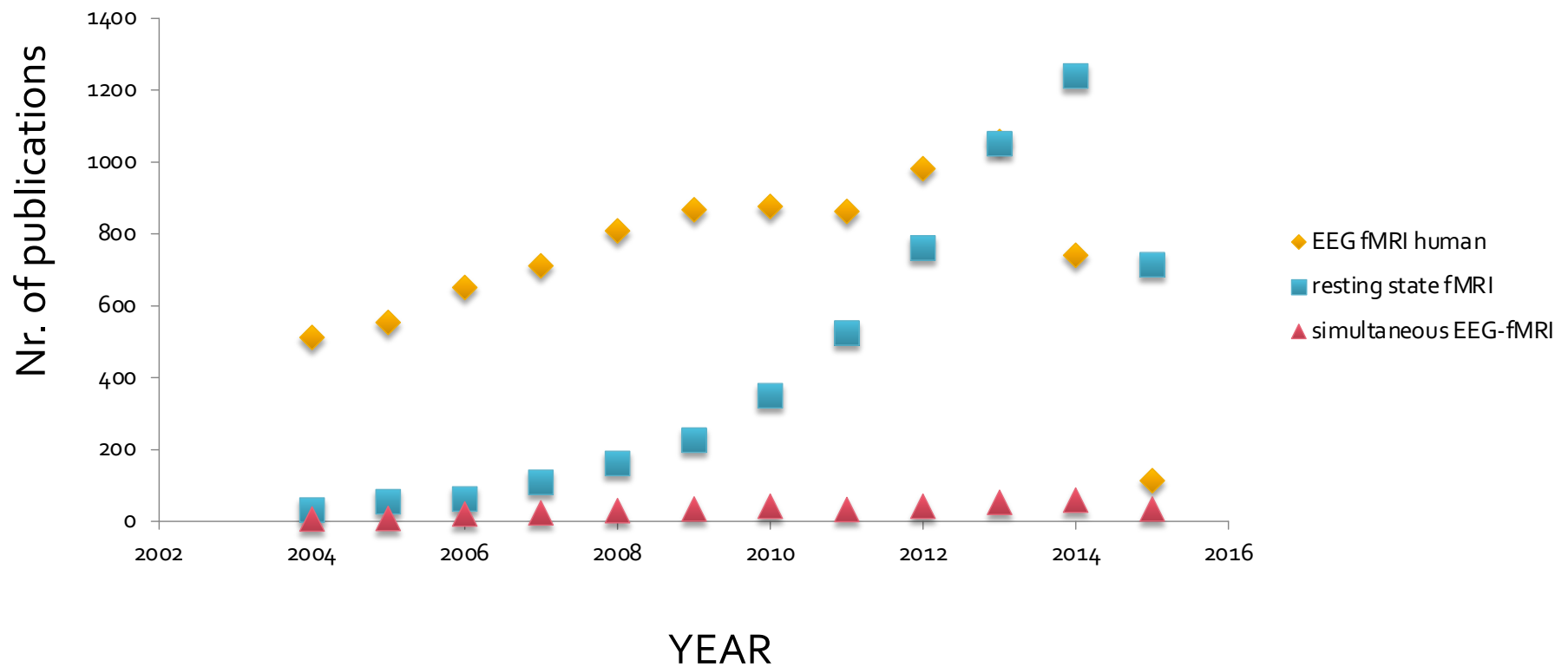
# fMRI



EEG is the *gold standard* for sleep studies, epilepsy, some cognitive tasks, etc

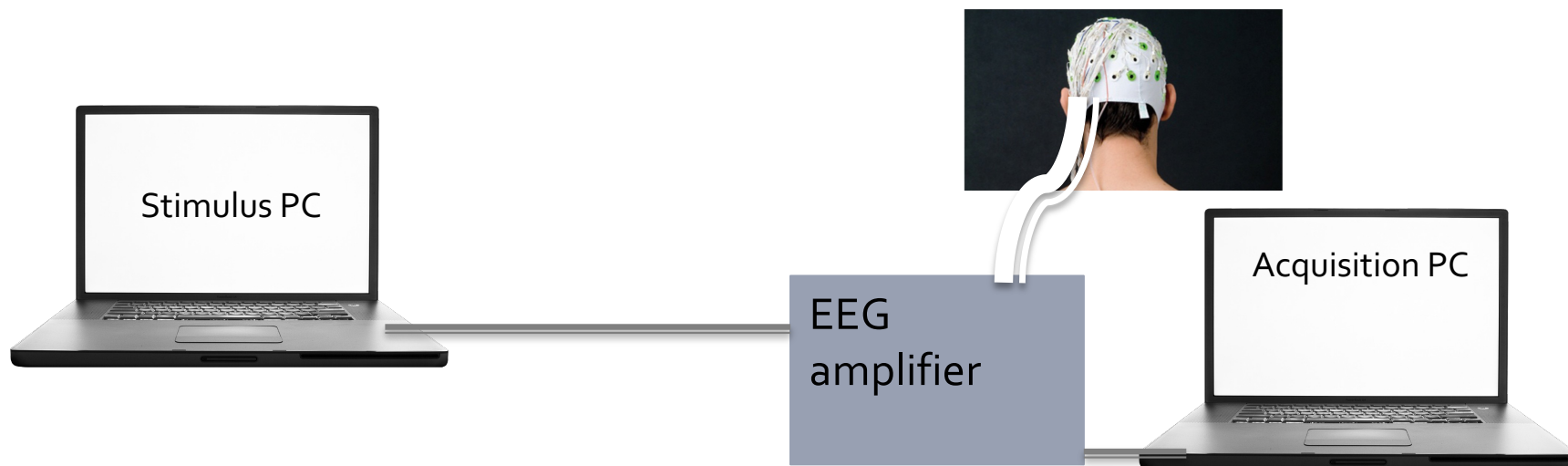


# HOW often measured together?

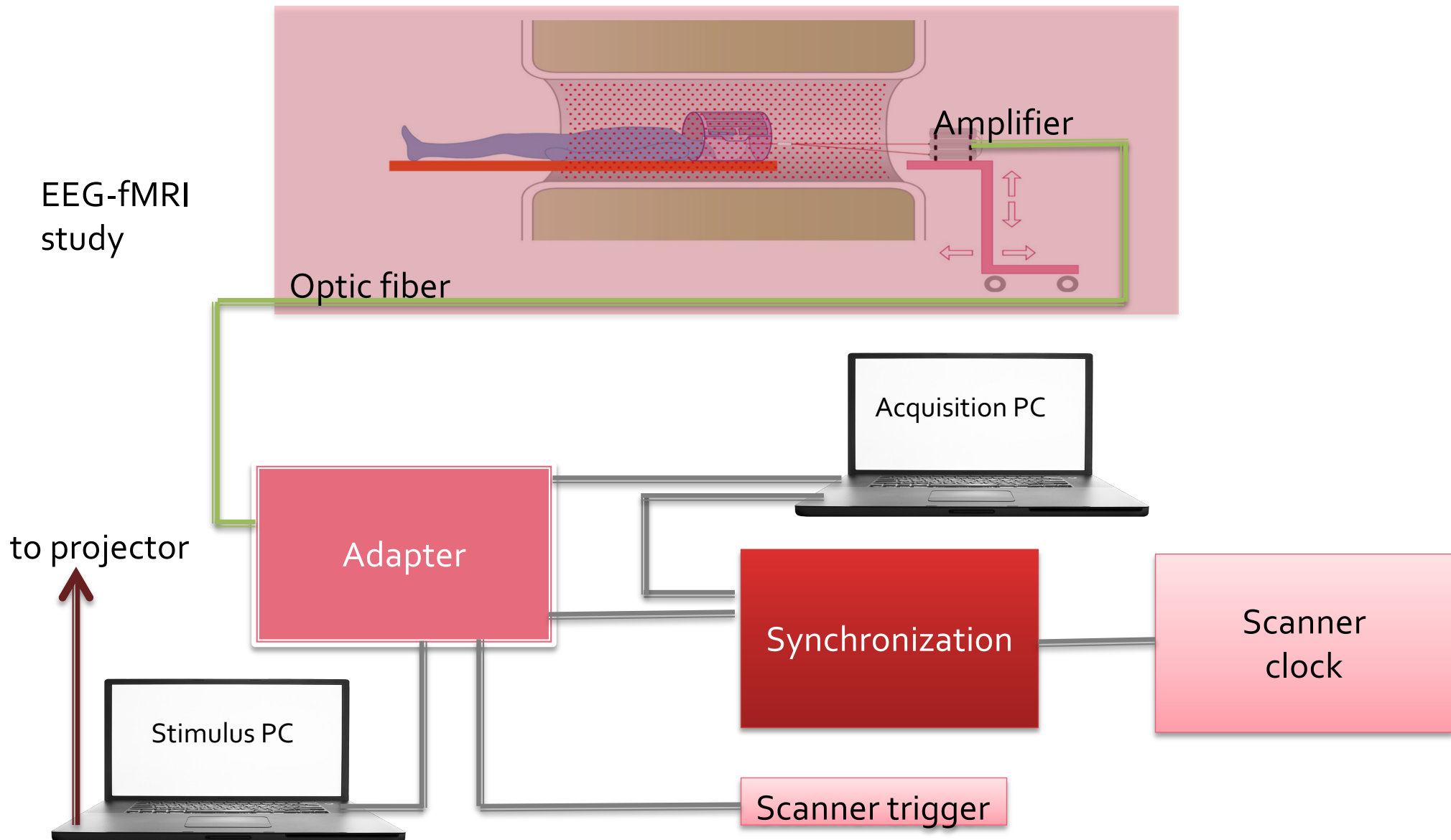


# EEG setup

EEG  
study



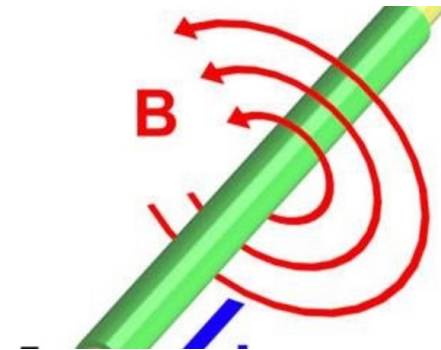
# EEG-fMRI setup



# Technical Issues

Electromagnetism

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Maxwell's Laws.

- A changing magnetic field produces an electric field

**BIG PROBLEM**

- A changing electric field or current produces a magnetic field.

Luckily, the magnetic field change  
From the EEG does not affect the image quality!

# THE not so good NEWS

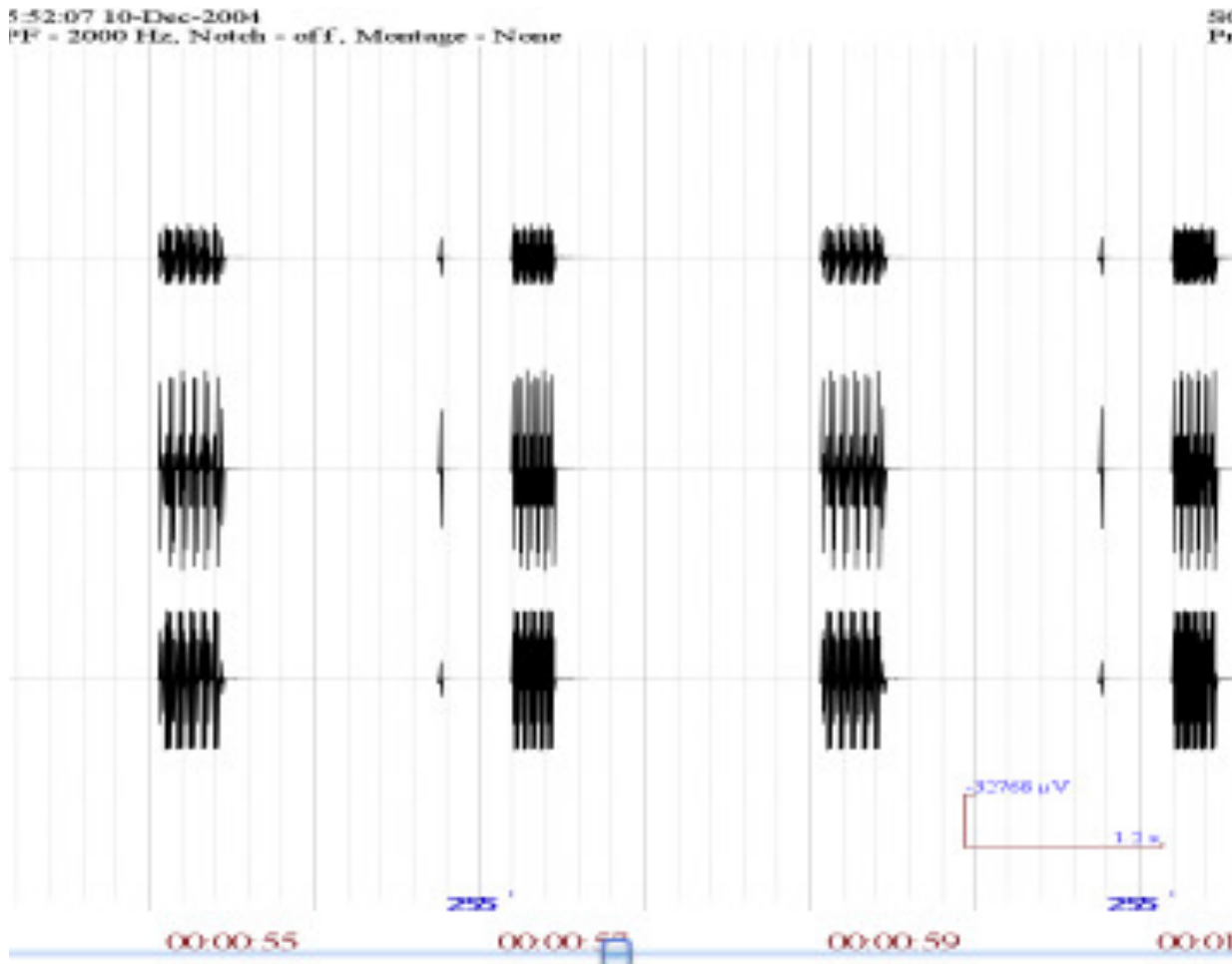
- **MRI is noisy**
  - Electrical noise → MRI and EEG were not meant for each other ...

Remember Maxwell's Law?

# Simultaneous EEG-fMRI

## - Technical issues

5-52:07 10-Dec-2004  
PF = 2000 Hz, Notch = off, Montage = None



Example from  
BOLD & Perfusion MRI sequence  
optimized for EEG-fMRI acquisition  
5 slices

Sources of artifacts:

- gradient artifact
- physiological noise:  
ballistocardiogram

# Simultaneous EEG-fMRI

## - Technical issues

Approximate values of different signals

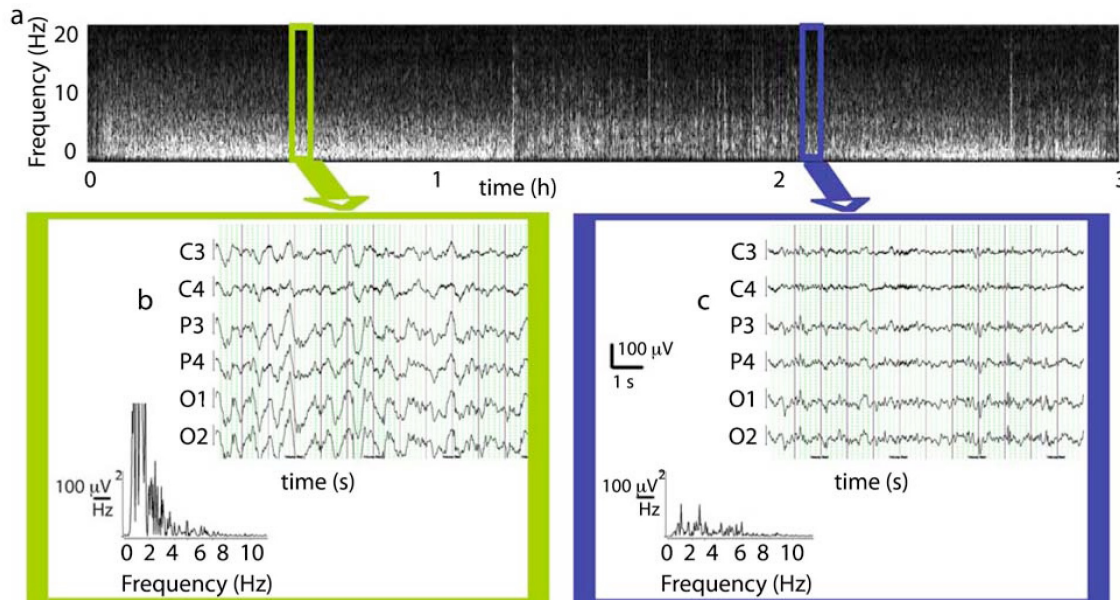
- Gradient artifact :  $\pm 10\text{mV}$
- EEG:  $\pm 150\mu\text{V}$
- BC artifact:  $\pm 200\mu\text{V}$
- Blink:  $\pm 150\mu\text{V}$
- Movement:  $< 1\text{mV}$
- ECG:  $\pm 20\mu\text{V}$
- EMG:  $\pm 50\mu\text{V}$
  
- Helium pump: 40-60Hz and



# THE good NEWS



- MRI compatible EEG equipment, leads and electrodes
  - Safe for the scanner
  - Safe for the subject



More on safety later

- Careful setup:
  - Equipment
  - Cables
  - Subject head

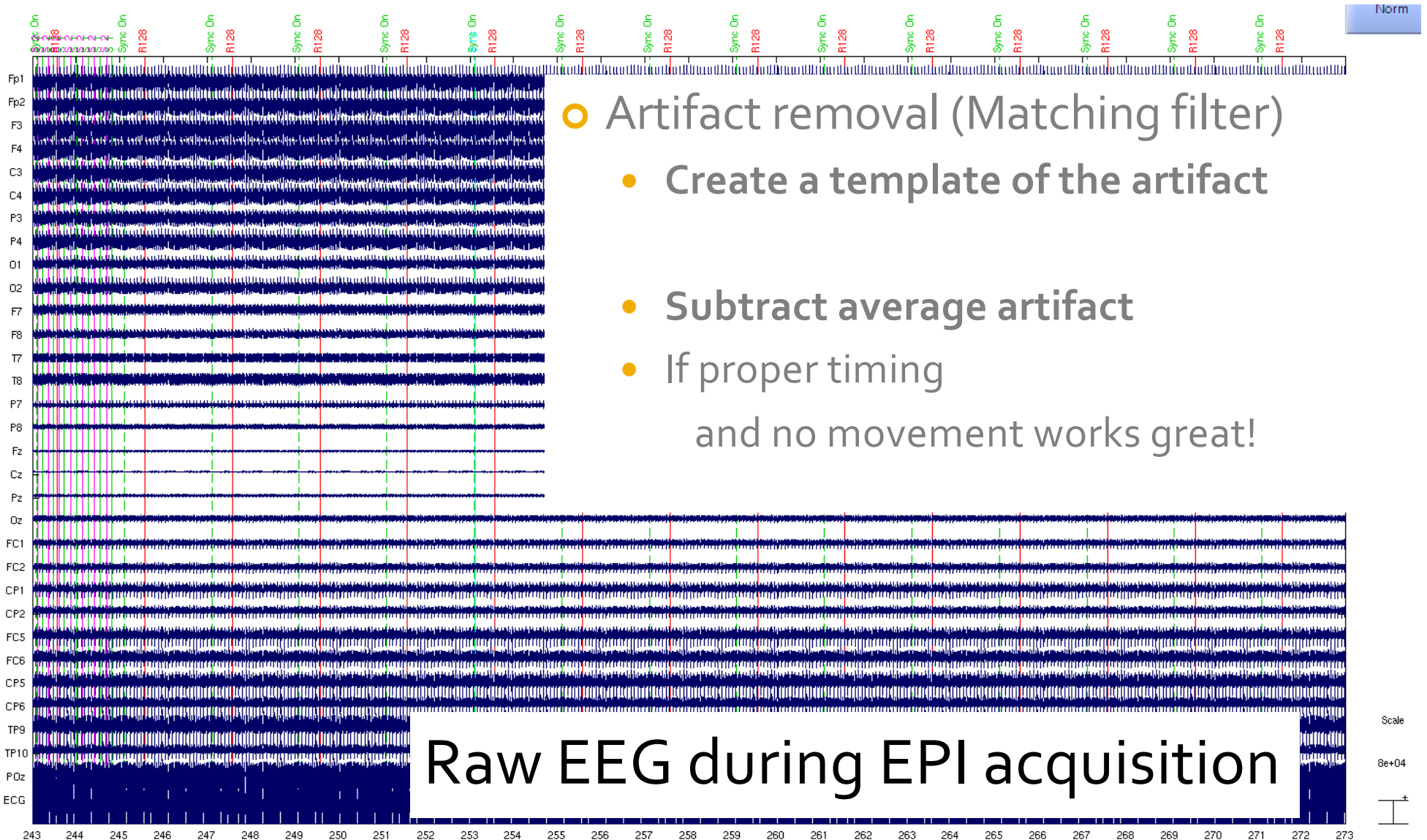
# DATA acquisition

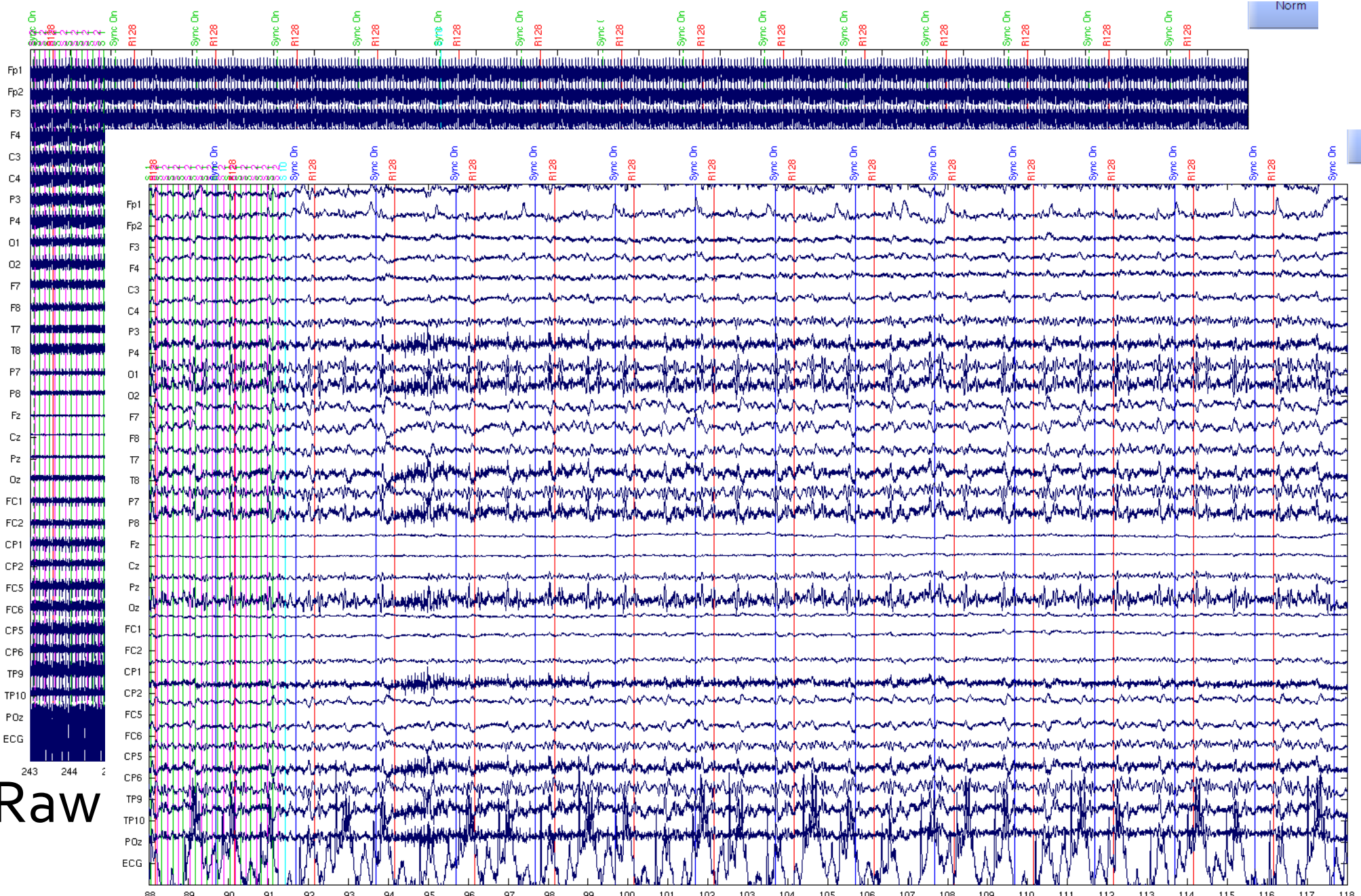
- Sample EEG at 5 kHz (or more)
- Slice TR at a frequency that is not of interest (and a round number)
- Low Pass Filter at 250Hz
- ~0.01 Hz high pass to avoid saturation (use DC only if enough range )
- Volume (or slice) marker
- Resolution:  $0.5\mu\text{V}$  (make sure dynamic range covers the signal, depends on scanner and configuration)
- Clock synchronization

# EEG DATA acquisition

- **Make sure amplifiers do not saturate**  
Adjust amplifier resolution
- **Keep electrodes' impedance low** (unless using high impedance equipment)
- **Keep cabling safe and fixed**
- **Have a good cardiac signal**
- **Adjust MR sequence**
- **Adjust experiment (ISI  $\leftrightarrow$  TR)**

# Gradient artifact removal





Raw

Gradient artifact corrected

Dr Jen Evans

# Ballistocardiogram artifact removal

Matching filter (BV Analyzer) (Allen et al, 2000):

**Detect R**

Create a template

Subtract (allows for amplitude adjustment)

**Single Value Decomposition (Neuroscan)**

Run classification

Remove components

Reconstruct time series

**Optimal base set (EEGLAB Niazy, 2005)**

PCA to create bases

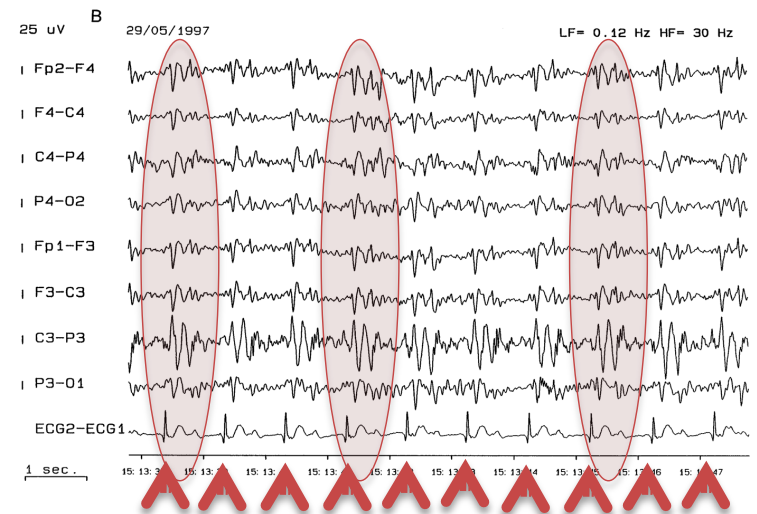
Fitting (adaptive algorithm)

Subtraction

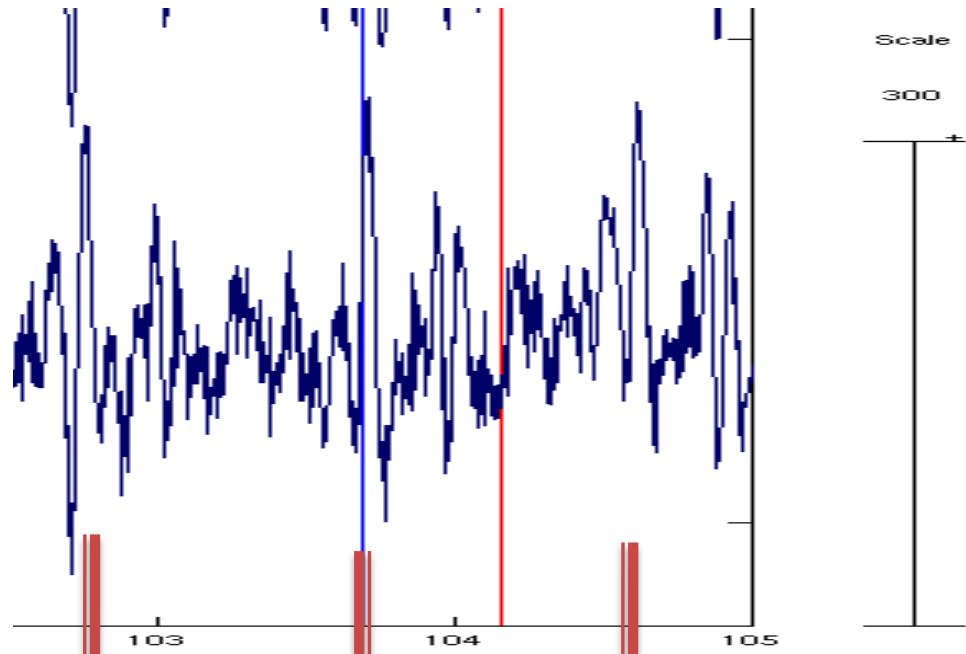
**Combinations**

i.e → Liu, 2012 use ICA, SVD & mutual information (based on Peng, IEEE 2005)

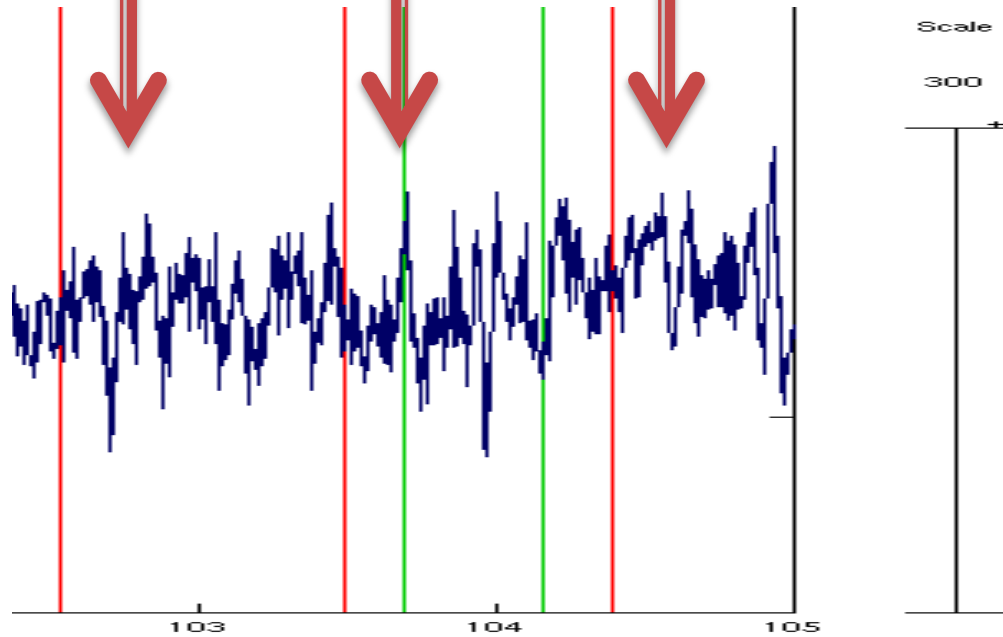
software download: <http://amri.ninds.nih.gov/cgi-bin/software>



Gradient artifact corrected

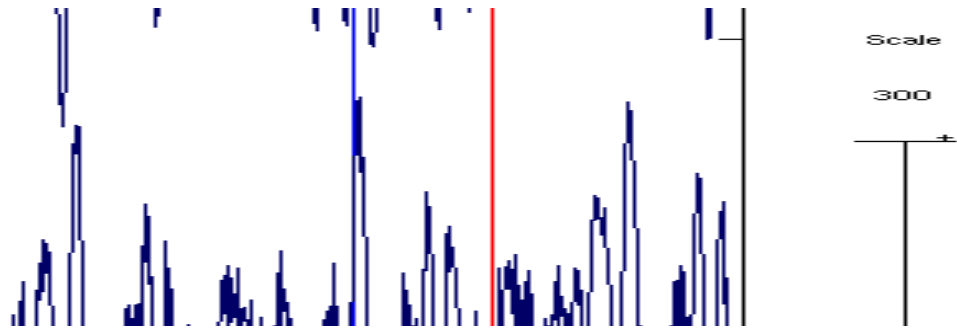


Cardioballistogram corrected

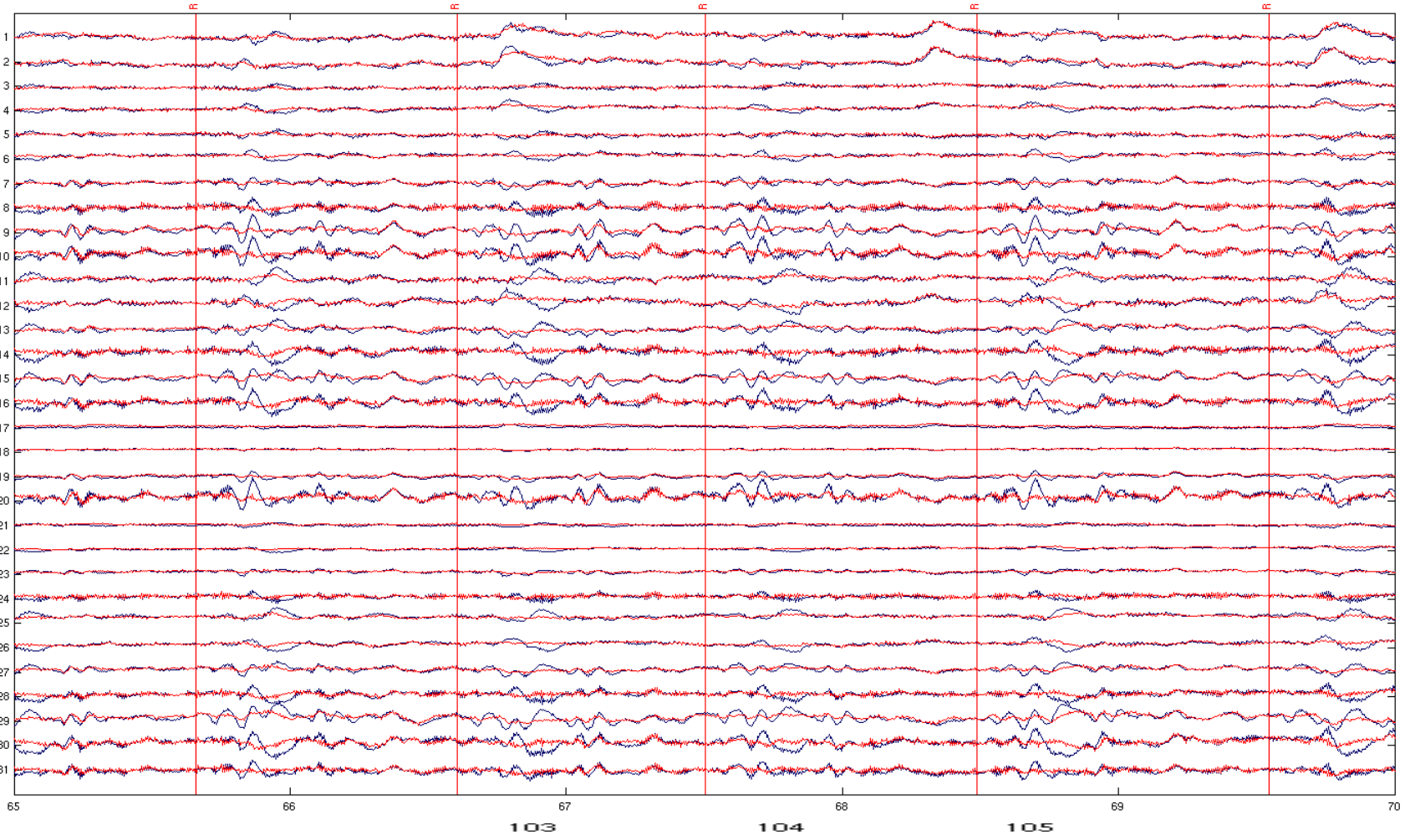




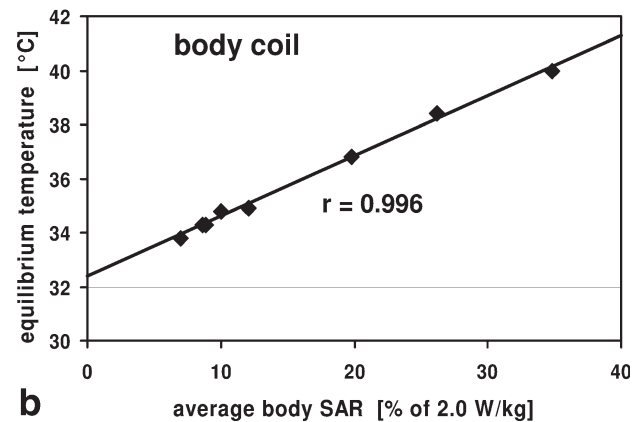
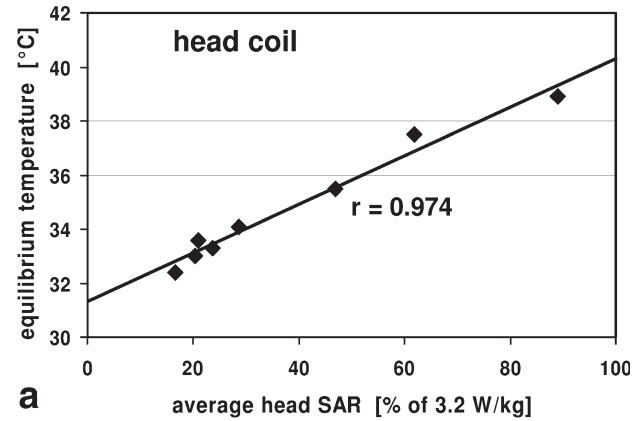
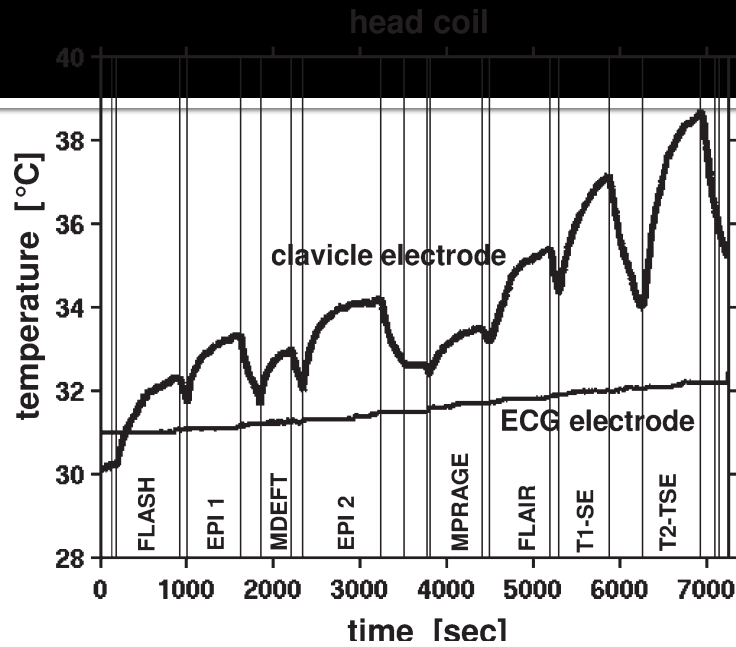
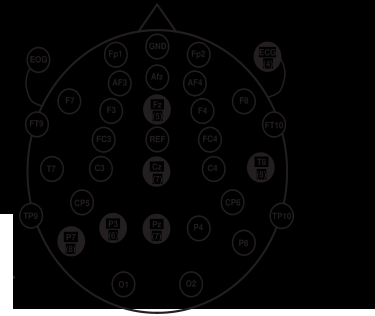
Grad  
corre



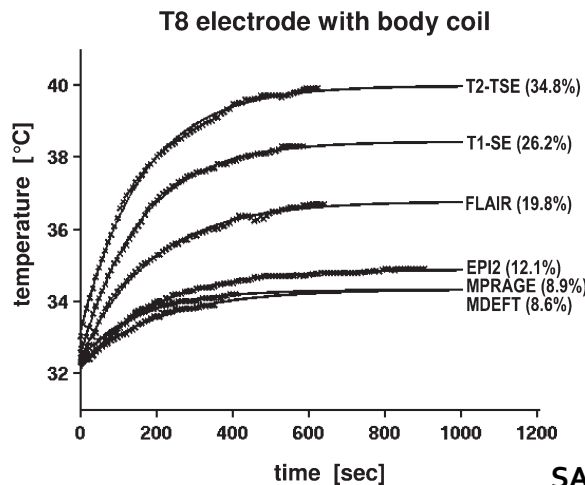
Card  
corre



# SAFETY considerations



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**Figure 5.** Relation between scanner-calculated average head (a) and body (b) SAR and fitted equilibrium temperatures for subject m90, clavicle electrode (a) and subject m85, T8 electrode (b) when using the head (a) and body (b) coil, respectively. The least-squares linear fit (solid line) shows a clear linear increase of the equilibrium temperature with average head (a) and body (b) SAR.

## Simultaneous Electroencephalography-Functional MRI at 3 T: An Analysis of Safety Risks Imposed by Performing Anatomical Reference Scans With the EEG Equipment in Place

Ulrike Nöth, Laufs, Stoermer, and Deichmann JMRI 2012

SAR: Specific Absorption Rate (or the energy deposited in the body by the radio frequency transmiss

# SAFETY considerations

## ■ Sequences

- EPIs (in most cases ok to run an MPRAGE for localization)  
be aware of high res short TR EPIs (pay attention to SAR)  
Special sequences require special safety testing

## ■ Set up

- Cables straight and in the center.  
Avoid loops
- Equipment as far back from iso-center as possible  
(far front for EMG)  
All scanners are **not** equal; gradients and coils affect electrodes' temperature

Be aware different body shapes and weight load coil differently

# Interim Summary

- EEG measurements have:
  - Good temporal resolution
  - Poor spatial resolution  
(when measure non invasively)
- Electrical and hemodynamic responses are related
- Simultaneous EEG-fMRI requires special equipment
- **SAFETY PROCEDURES ARE KEY**
- Dimensionality reduction is needed for data integration

**When do we want to measure EEG  
and fMRI simultaneously?**

# When is it important to measure simultaneously?

- **State dependent analysis**
  - Alertness
  - State vs Trait
  - understanding of BOLD signal/EEG origins
- **Physiological markers defined by EEG**
  - Seizures
  - Sleep stages

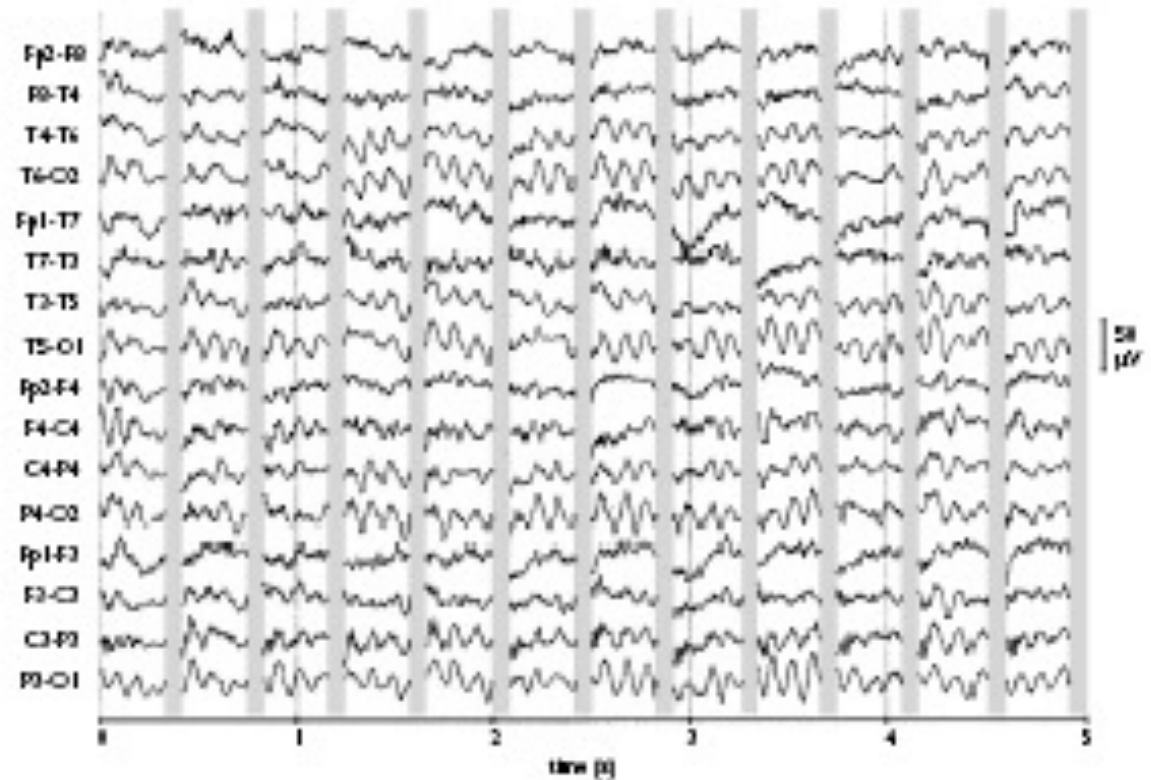
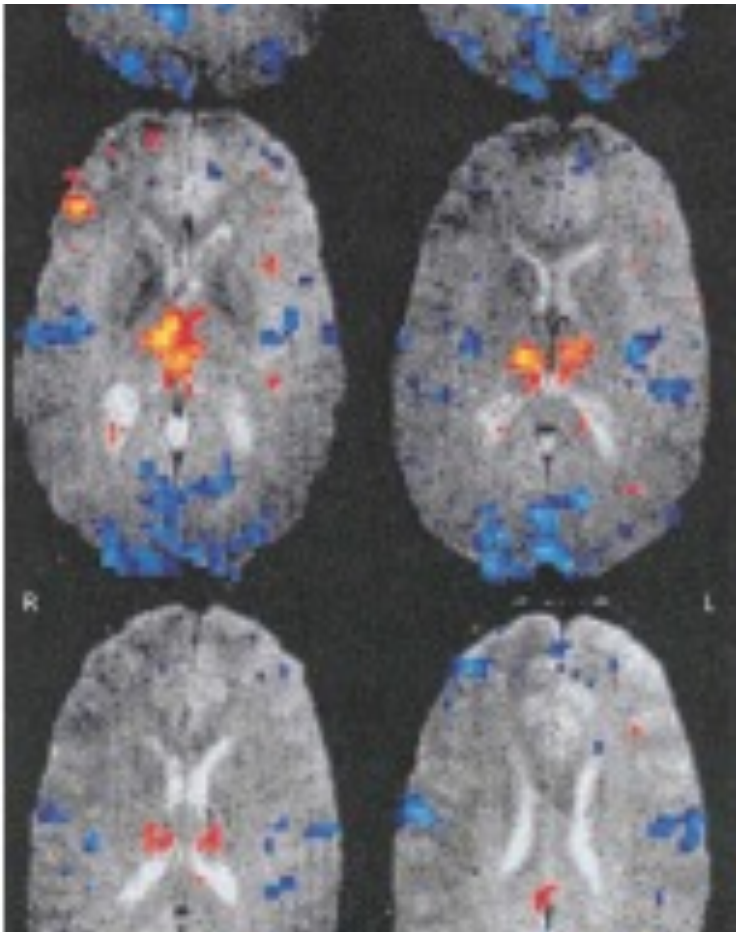
# Type of studies

- Correlations of EEG and fMRI
  - In time domain
  - In frequency domain
- Multivariate methods
  - ICA
- Informing one with the other
  - Sorting data and perform analysis in one modality
- Mix analysis



# EEG parameter as regressor

# BOLD-EEG band-power correlations

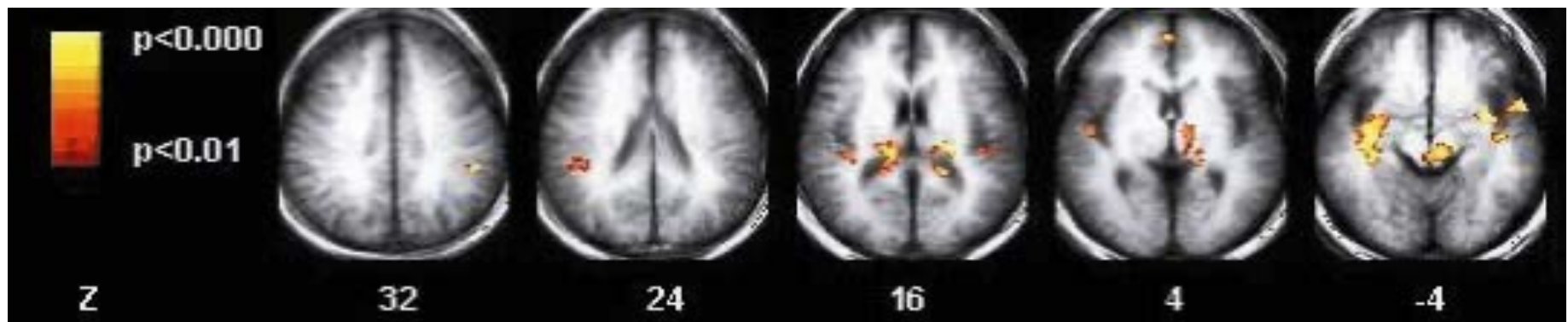
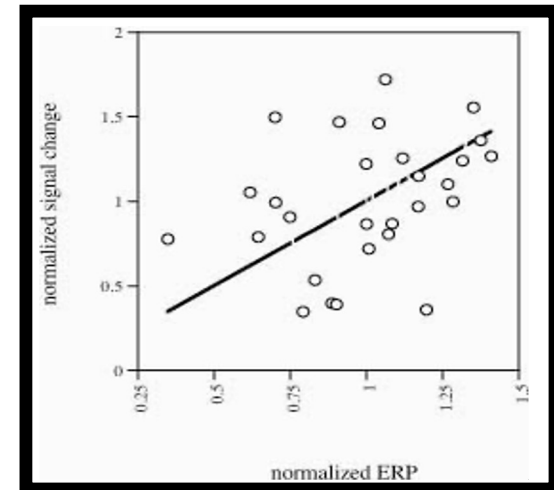
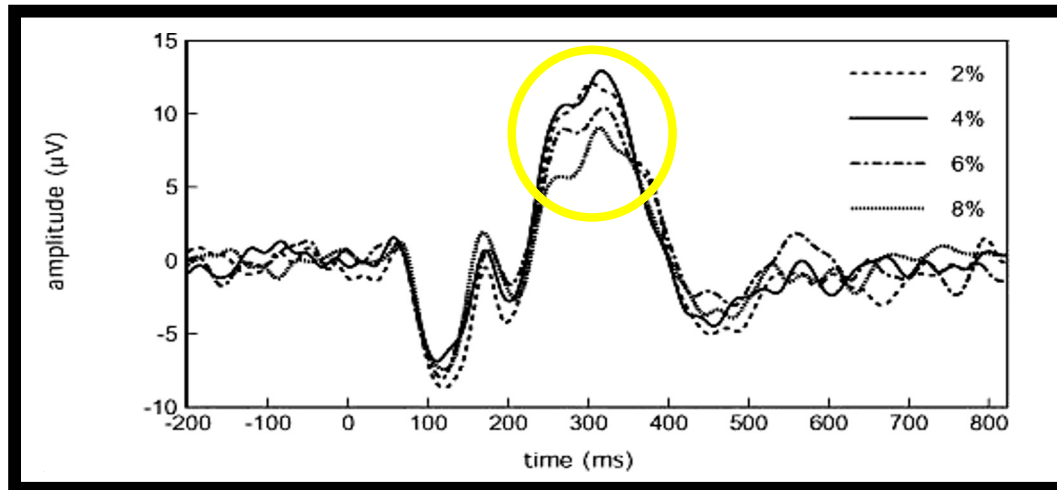


Goldman et al. 2002

[Simultaneous EEG and fMRI of the alpha rhythm.](#)

# How to link time and space information?

## Parametric studies and correlational analysis

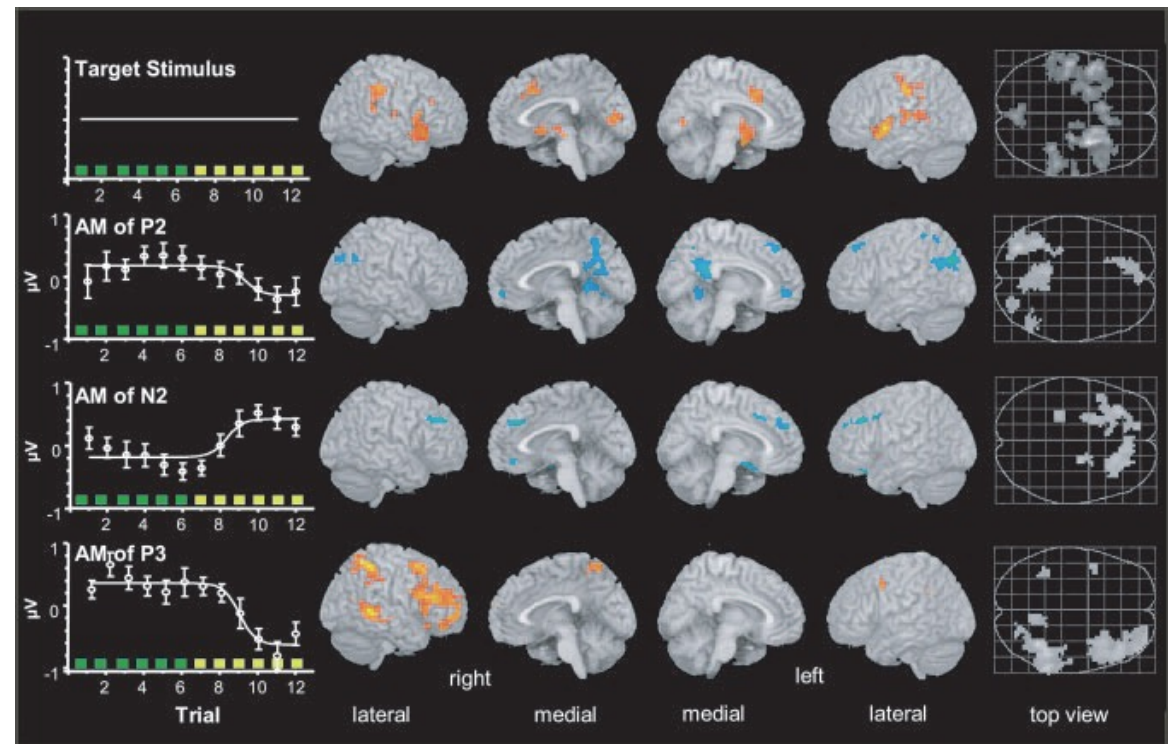
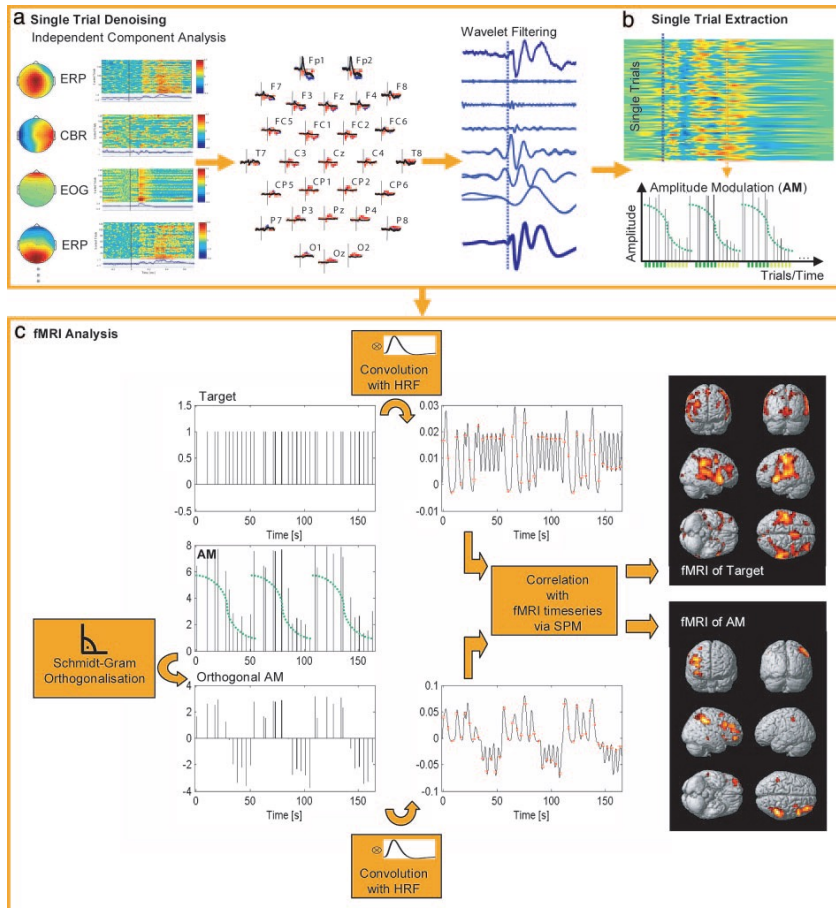


Correlation maps between fMRI signal change and P300 amplitude. Composite of 7 subjects.  
Horovitz et al MRI, 2002

OLD DAYS: SAME SUBJECTS, EEG AND FMRI ON SEPARATE SESSIONS

# Assessing the spatiotemporal evolution of neuronal activation with single-trial event-related potentials and functional MRI

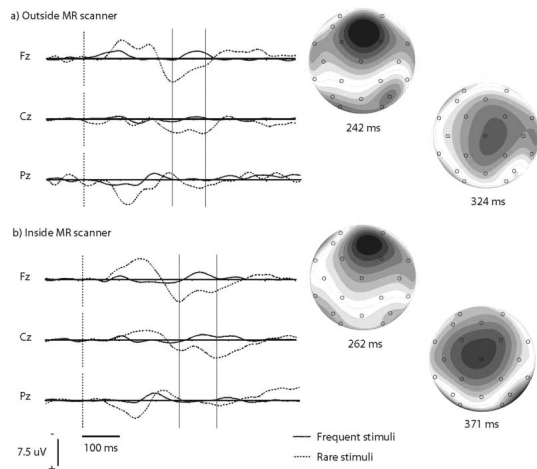
Tom Eichele PNAS 2005 vol. 102 no. 49



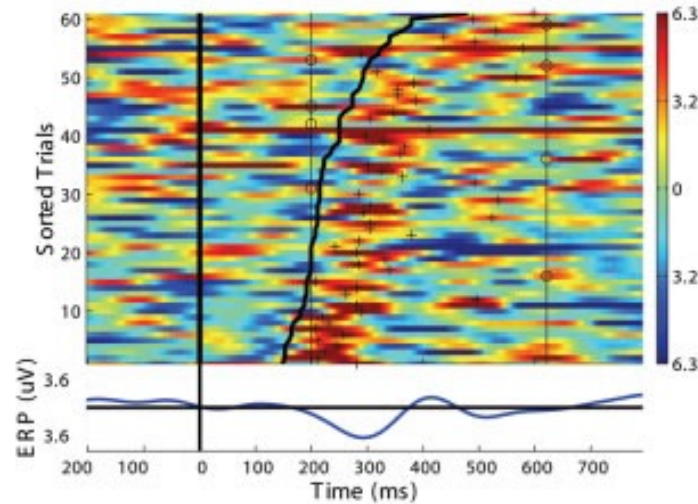


# Single-Trial Analysis of Oddball Event-Related Potentials in Simultaneous EEG-fMRI

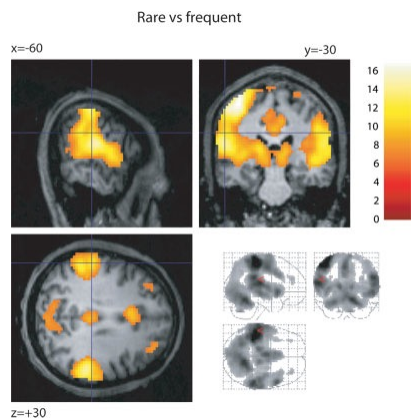
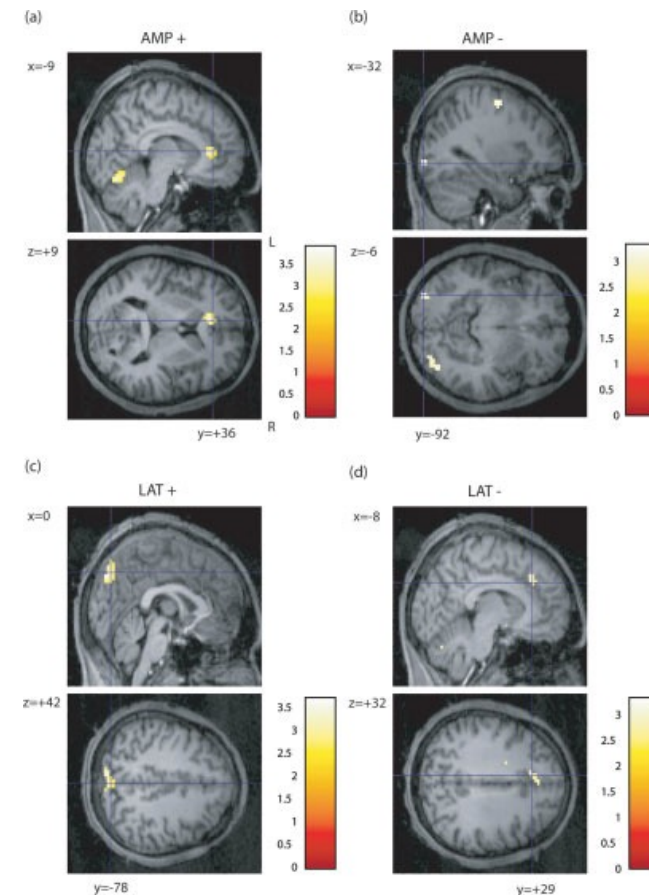
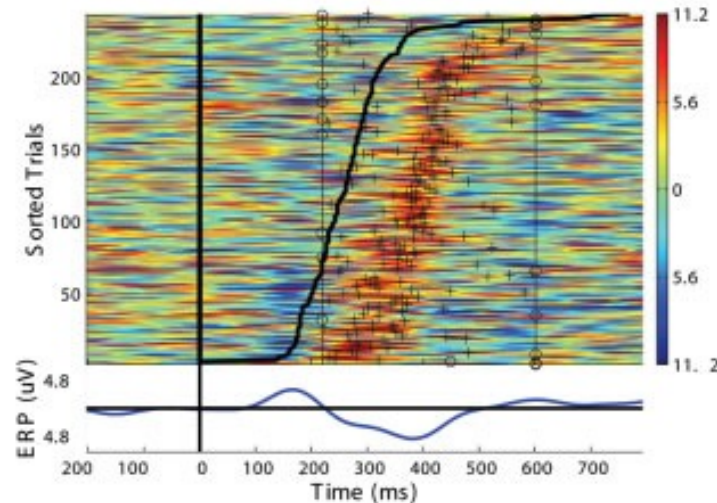
Benar et al. Human Brain Mapping 28:602–613 (2007)



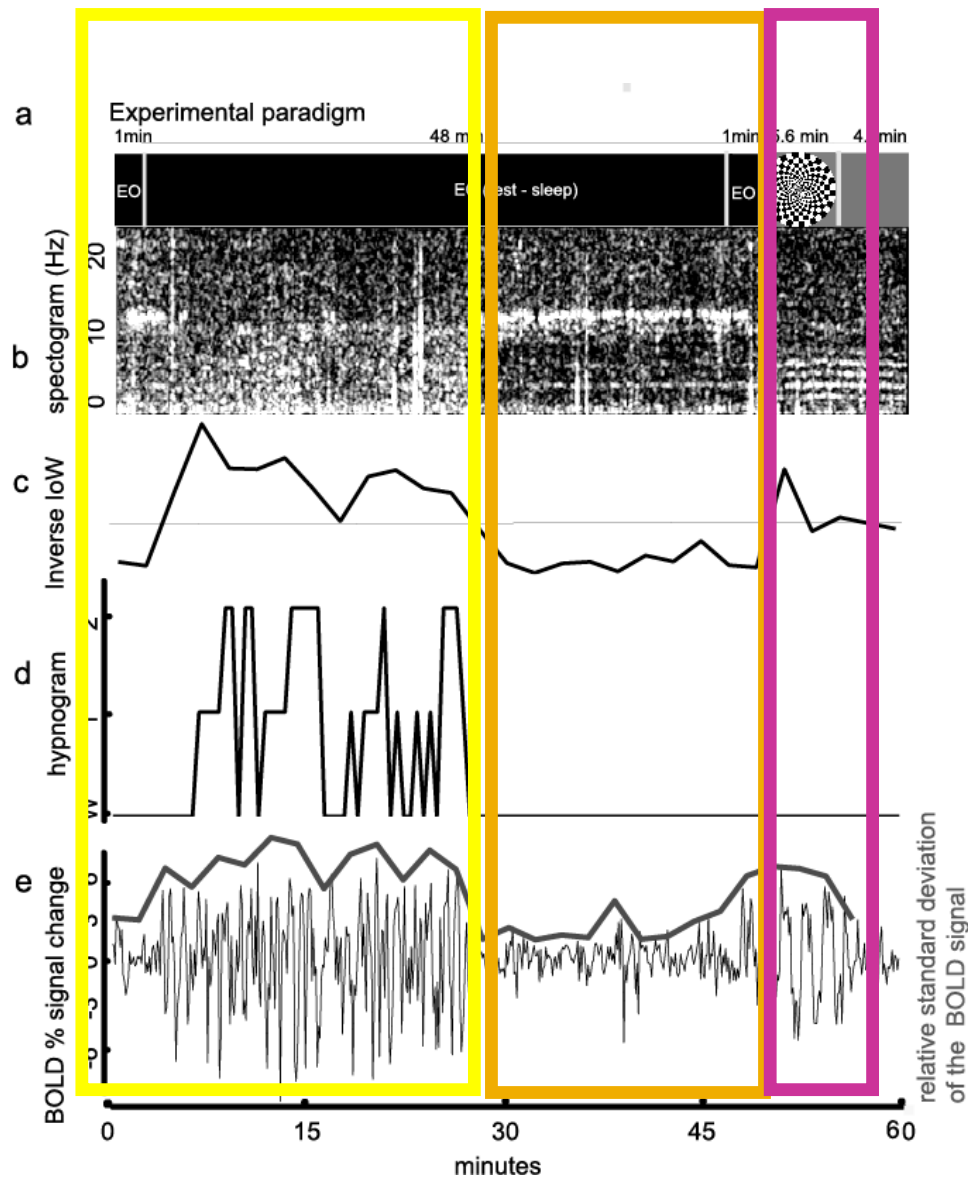
a) Outside MR scanner



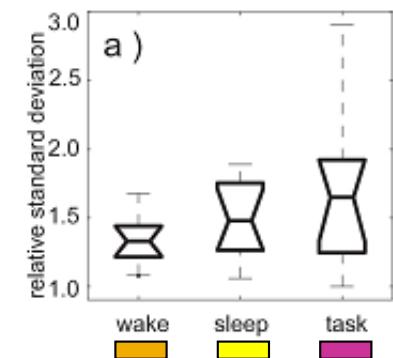
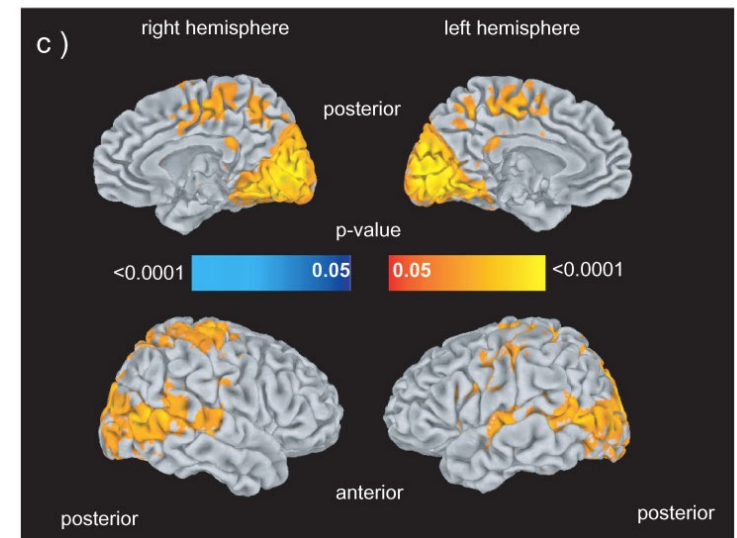
b) Inside MR scanner



# Correlation between Amplitude of BOLD fluctuations and alertness Index derived from EEG



Horowitz et al HBM, 2008



# EEG to define states

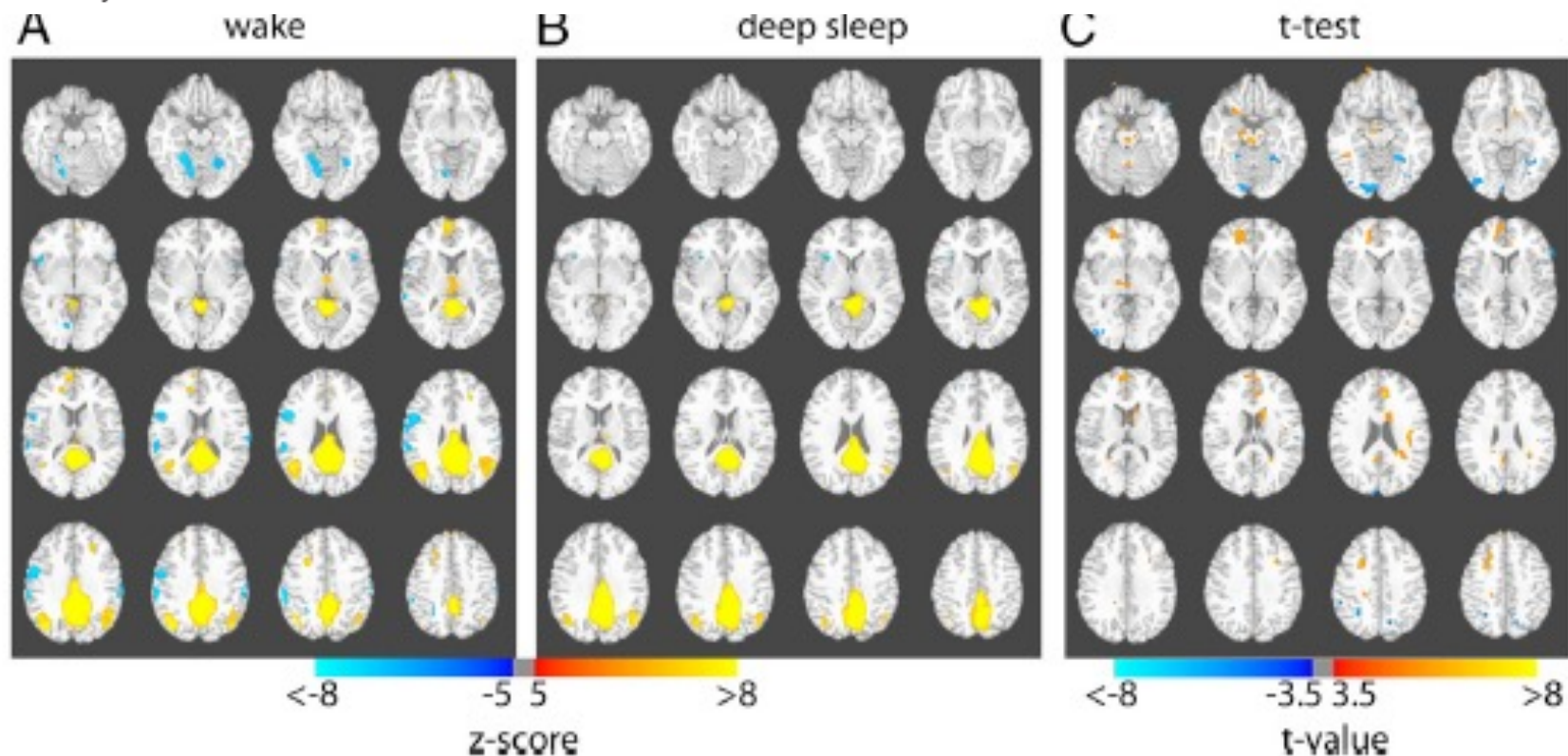
# Use EEG to sort fMRI data

## Changes in the level of consciousness

### Decoupling of the brain's default mode network during deep sleep

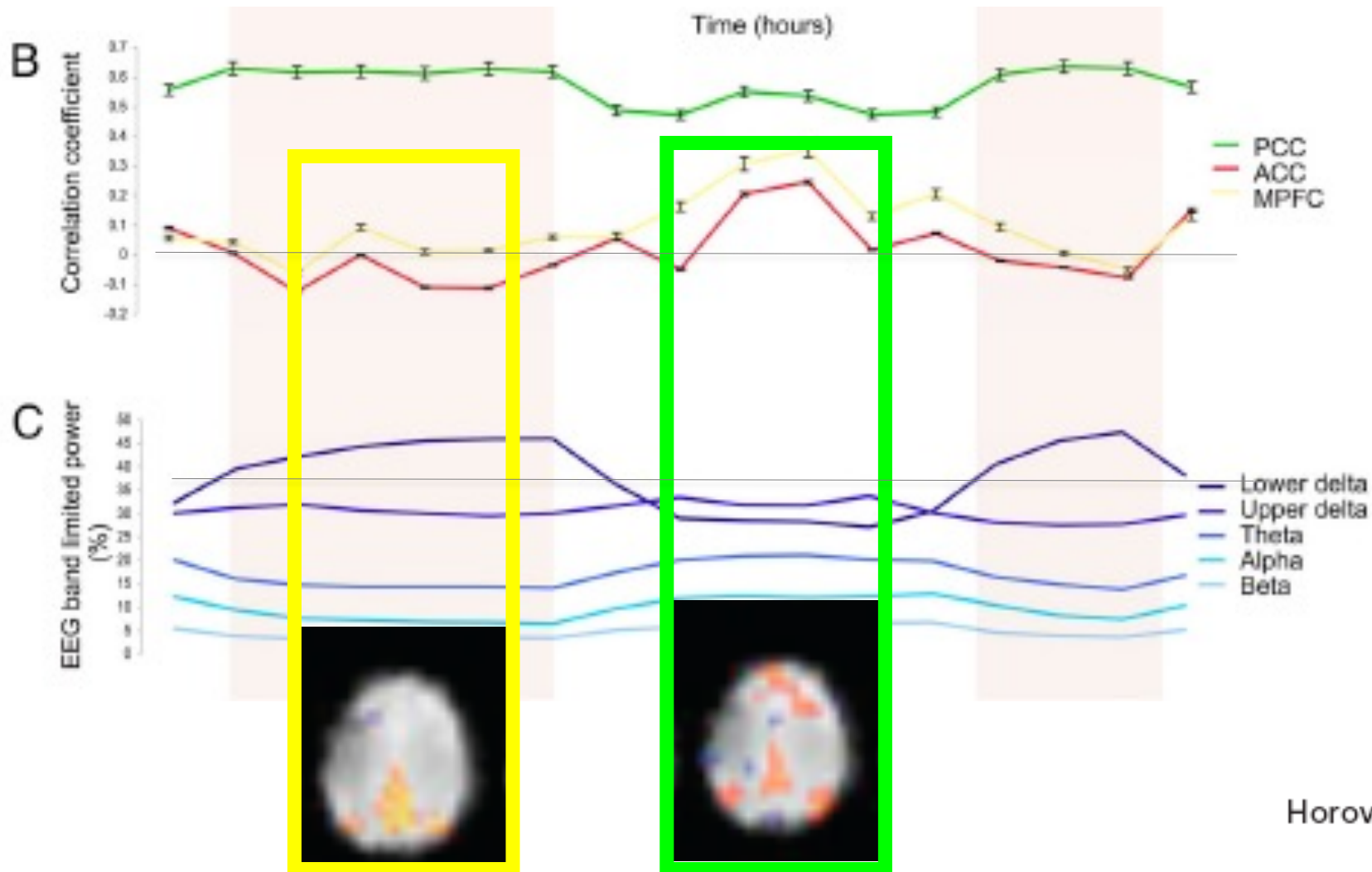
11276-11281 | PNAS | July 7, 2009 | vol. 106 | no. 27

Silvina G. Horowitz<sup>a,b,1</sup>, Allen R. Braun<sup>c</sup>, Walter S. Carr<sup>d</sup>, Dante Picchioni<sup>e</sup>, Thomas J. Balkin<sup>e</sup>, Masaki Fukunaga<sup>b</sup>, and Jeff H. Duyn<sup>b</sup>





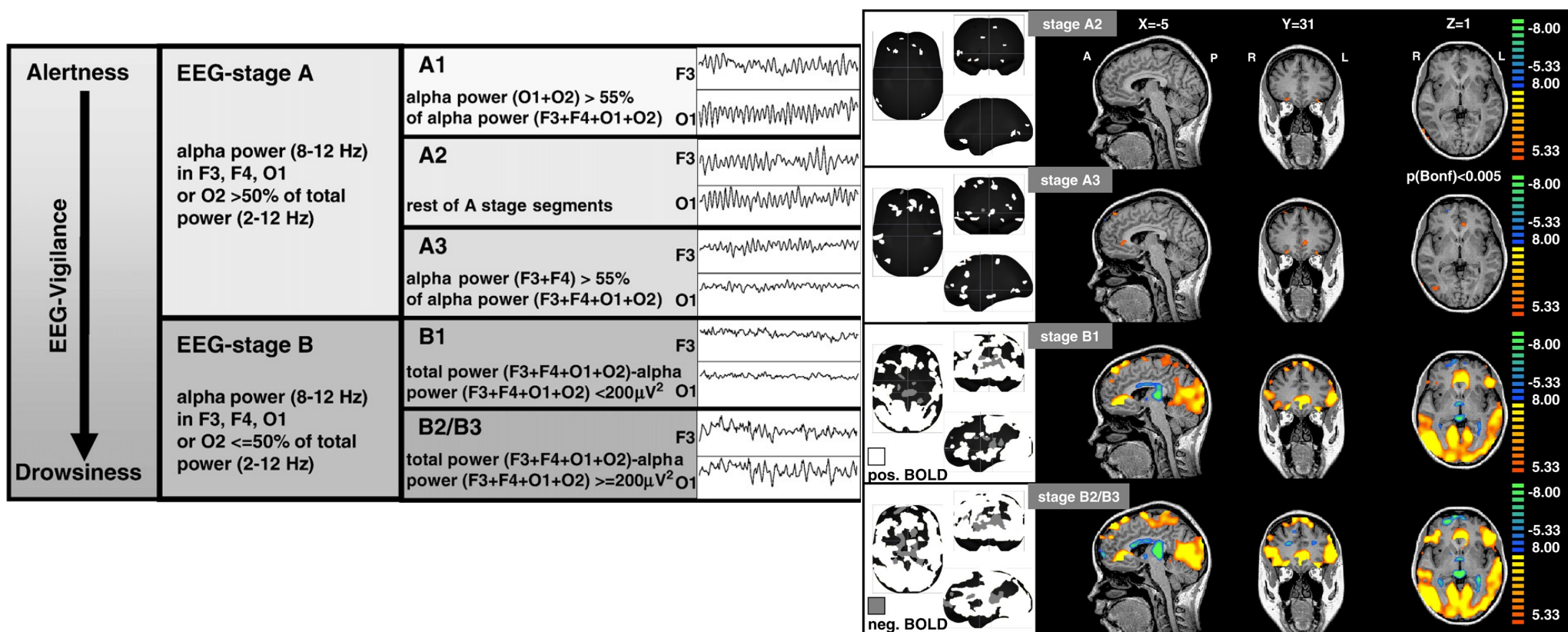
# Do changes in connectivity over time have a physiological origin?



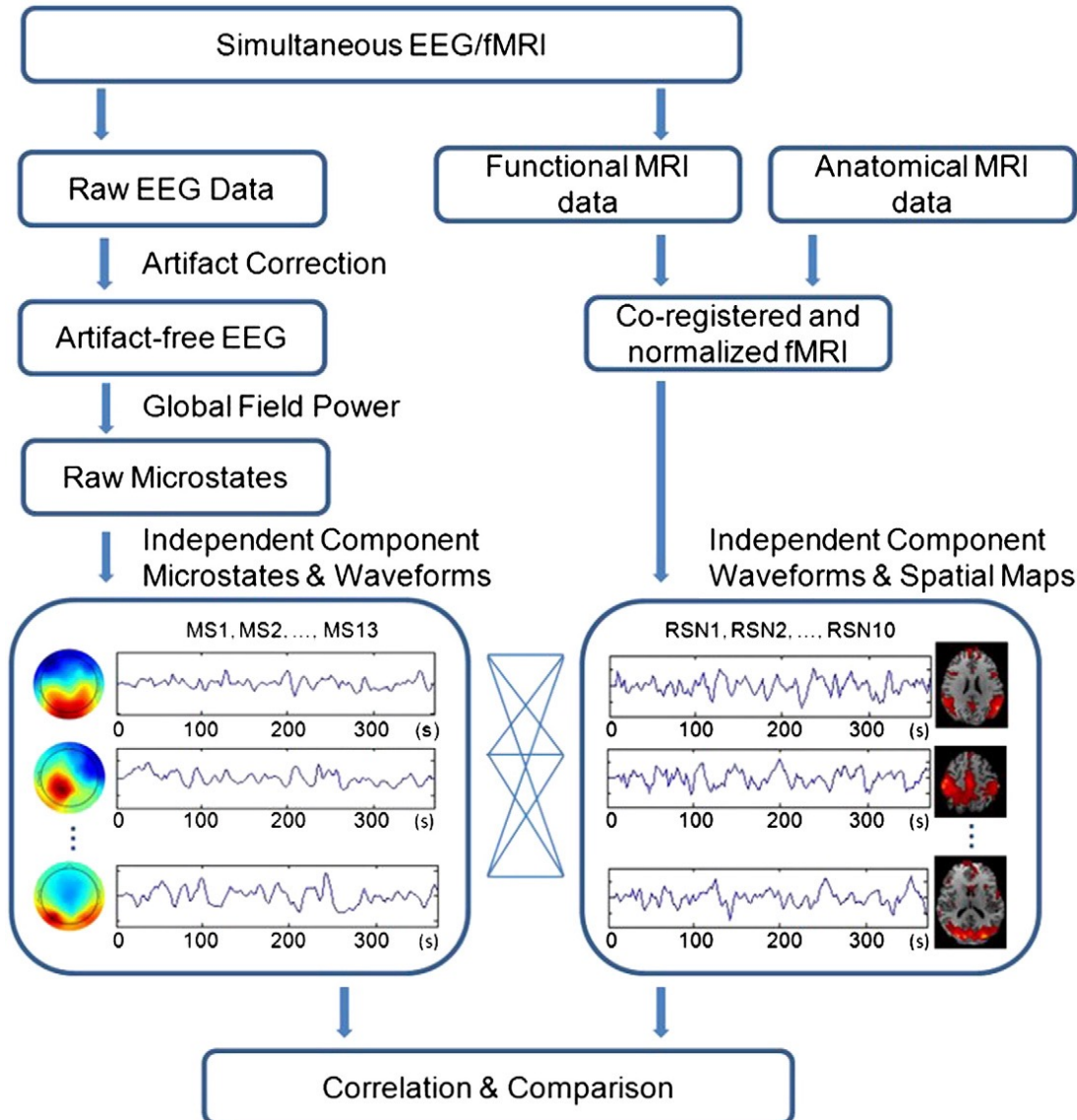
Horovitz et al.

# EEG-vigilance and BOLD effect during simultaneous EEG/fMRI measurement

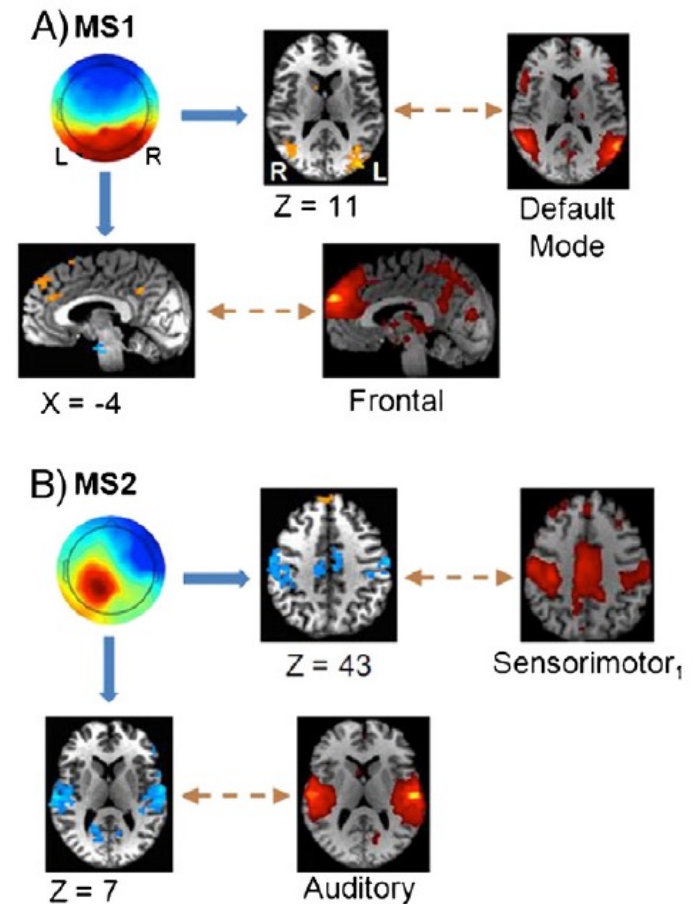
S. Olbrich et al. / NeuroImage 45 (2009) 319–



# Spatiotemporal dynamics of the brain at rest- exploring EEG microstates as electrophysiological signatures of BOLD resting state networks.



[Yuan H, Zotev V, Phillips R, Drevets WC, Bodurka J. Neuroimage. 2012](#)

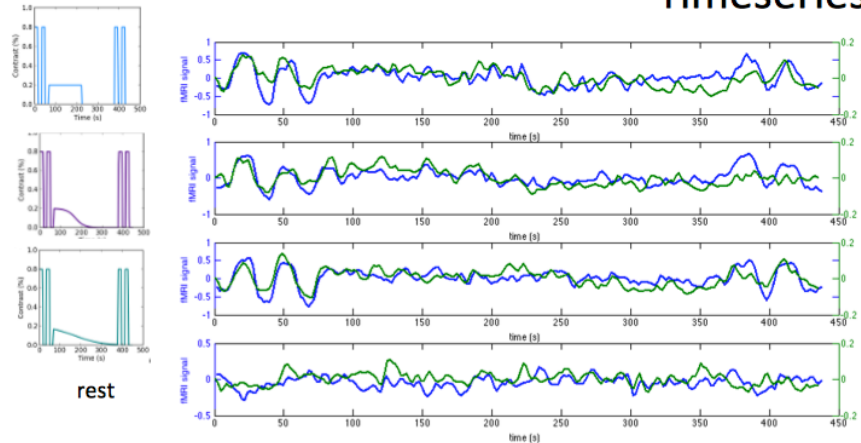


# EEG to understand BOLD signal



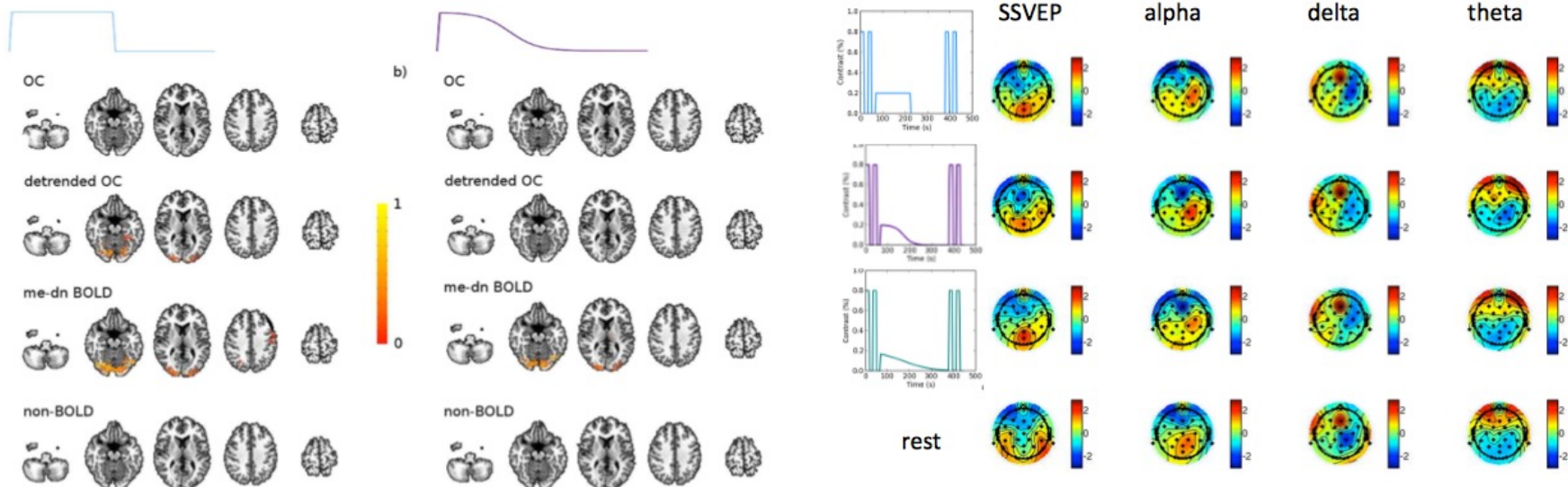
# Correlations of simultaneously acquired SSVEPs with BOLD fMRI response

## Timeseries



The graphs to the left show the group average MR (blue) and EEG (green) timeseries signals for each task. Excellent agreement is found between modalities. However, the amplitude of the last flanking blocks seems decreased in the SSVEP signal.

## Spatial Localization



# EEG & fMRI to study disease

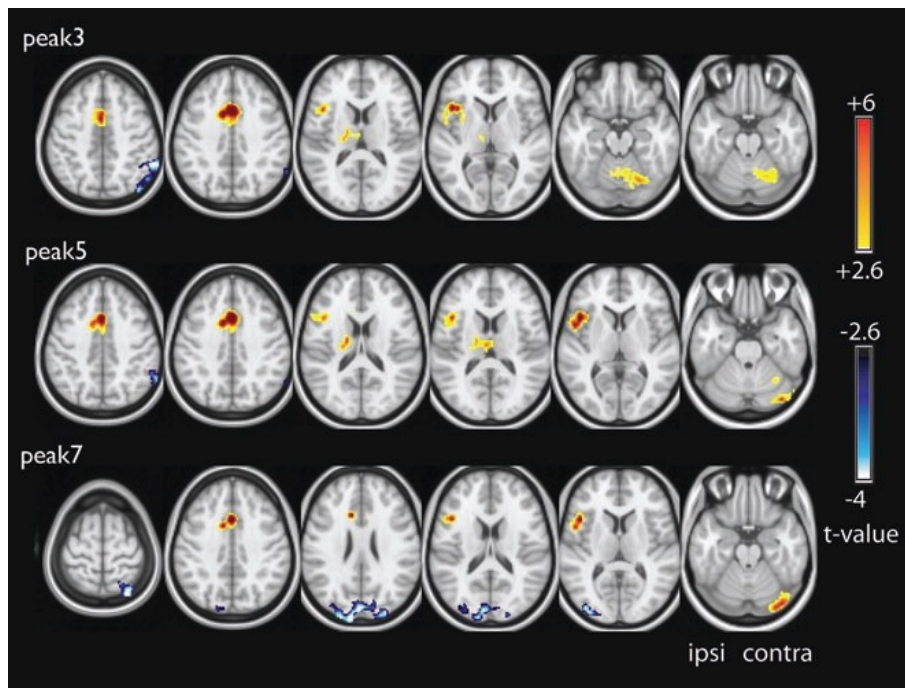
# Widespread epileptic networks in focal epilepsies—EEG-fMRI study

Fahoum et al *Epilepsia*, 53(9), 2012

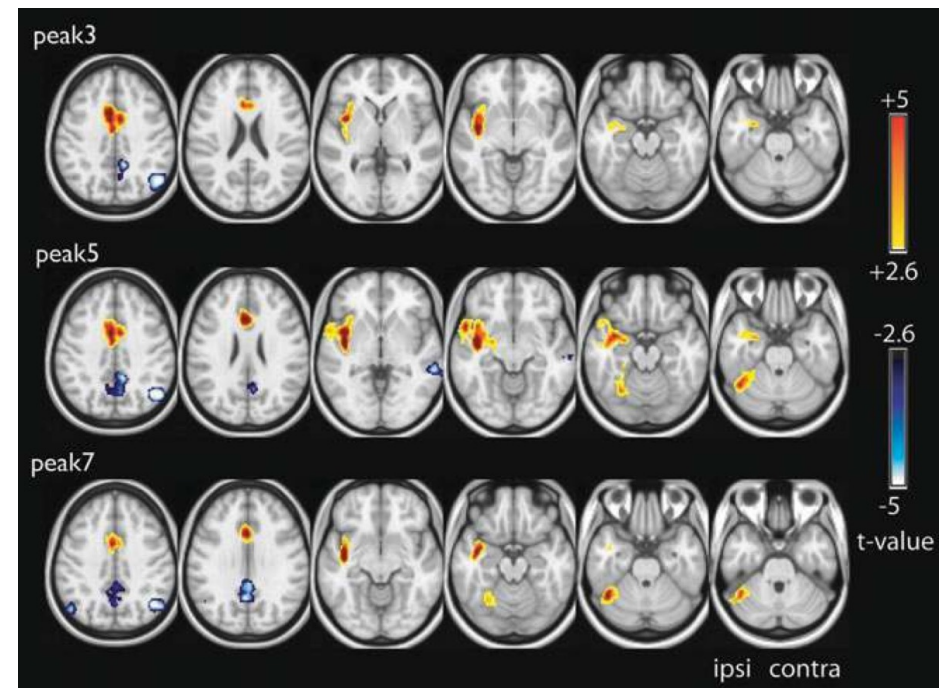
Group analysis results for hemodynamic response functions peaking at 3, 5, and 7 s after the interictal epileptic discharges

Different epileptic syndromes result in unique and widespread networks related to focal IEDs.

FLE group (n = 14)

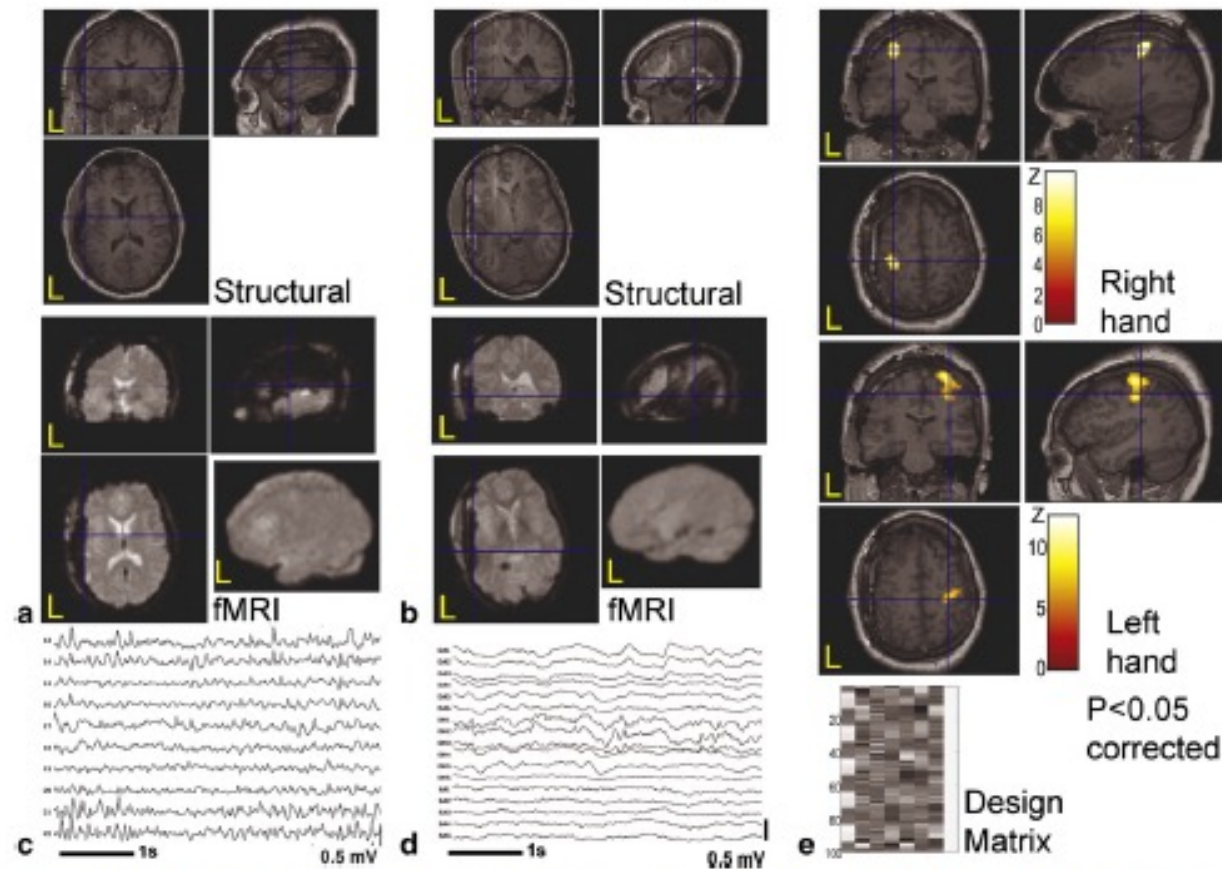


TLE group (n = 32)



Between April 2006 and December 2010, 168 consecutive 3T EEG-fMRI scans were performed in focal epilepsy patients

# intracranial recordings - fMRI



**Fig. 3.** Simultaneously acquired MRI and icEEG data quality; visual comparison. The same three orthogonal views are displayed of MRI structural (top left) and fMRI data (bottom middle left) in patient #1. The cross hairs indicate the displayed slices through the volume and are centred near the implanted electrode contacts. These are displayed overlaid on the reconstructed brain surface from the T1-weighted volumetric MRI. The fMRI data volume (bottom left) is also surface reconstructed to visualise image artefact levels. As in 'c' for patient #2. A segment of MRI scanner artefact corrected icEEG for patient #1. As in 'c' for patient #2. The results of the left vs. right hand finger tap task in patient #1 with the fMRI response visible immediately beneath the electrode contacts on the cortical surface.



# Simultaneous EEG-fMRI summary

- Safety first!
- Quality control at experiment setup & data collection
  - Equipment setup
  - Pulse sequence
  - Task design
- EEG pre-processing
  - Gradient & ballistocardiogram artifacts
- Data integration
  - Dimensionality reduction
    - Spatial correlations
    - Regressions
    - Sorting data based on state
- Some applications
  - Understanding BOLD signal
  - Understanding Disease
  - Origins of EEG signals
  - State dependent studies