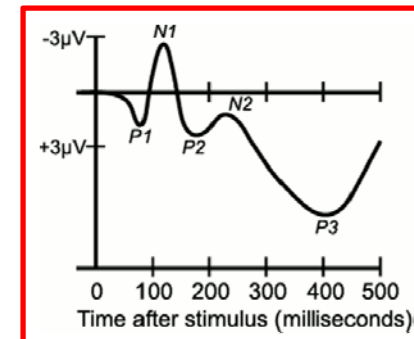
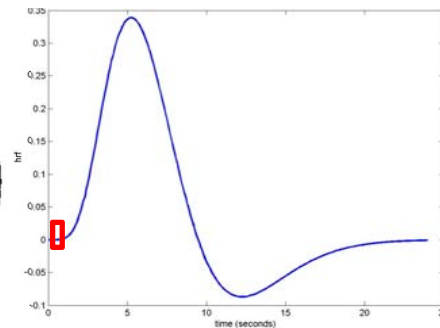
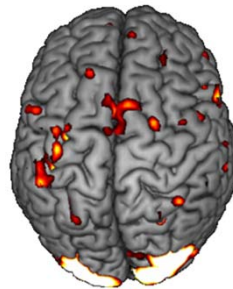


# fMRI/EEG integration

Simultaneous recording of fMRI and EEG data in one session



fMRI



EEG

## Outline

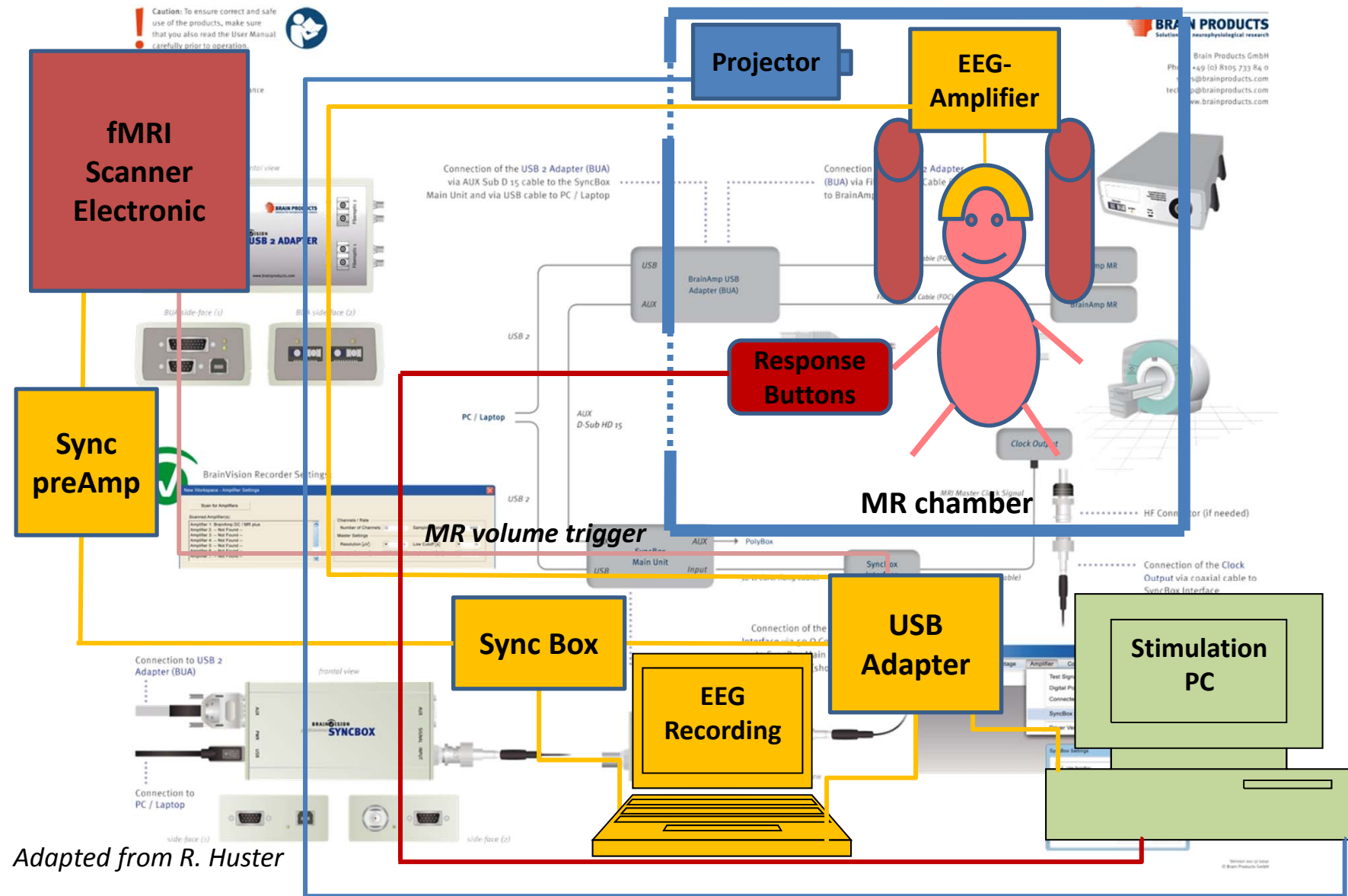
**1. Data Acquisition**

**2. Data Preprocessing**

**3. Data Integration**

**4. Benefits and Limitations**

# 1. Data Acquisition



Adapted from R. Huster

# 1. Data Acquisition

## Things to consider upfront

### Paradigm adjustments

- Deliver task like in a regular fMRI experiment, but:
- Include event codes in EEG data for later conditional averaging
- Stimulus timing should not be locked to the TR (fMRI volume) or slice repetition frequency



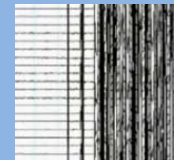
### EEG preparation at the scanner

- Requires extra time and space
- Requires MR-compatible EEG system
- Extra electrode on the back for cardiac signal (but real ECG is better)
- The lower the EEG impedances, the smaller the MR artifact!



### EEG recording in the scanner

→ MR and pulse (cardio) artifact!



- Synchronization of fMRI and EEG is essential for MR artifact correction! (TR = multiple of EEG clock period of 200  $\mu$ sec)
- Attenuate noise sources to reduce artifacts:
  - fMRI sequences may have to be optimized
  - Some head coils are better than others
  - Straight cable routing, isolate from MR table, use tape and sandbags to reduce vibrations
  - Turn off cryo pumps during scanning
  - Help participant to keep head still because motion amplifies artifacts!

# 1. Data Acquisition

## Things to consider upfront



## **! SAFETY FIRST !**

(in addition to the rules for regular fMRI experiments)

- Only use MR-certified non-magnetic equipment (caps, amplifiers, cables) !
- Only use “safe” MR sequences, check with local MR physicist (risk of heating) !
- Be extra careful when multiple helpers are involved (assign responsibilities) !

# 1. Data Acquisition

## The procedure in brief

- Prepare: MR scanner, stimulus computer, **EEG system for capping**
- Participant arrival: informed consent, MR checklist, instruction and practice, metal check
- Placing EEG and ECG: **correct cap size, electrode-scalp connection, impedance and signal check**
- Positioning: noise protection, **ensure “comfortable position”**, padding, place head coil, scanner table positioning, **connect amplifiers, fixate cables**

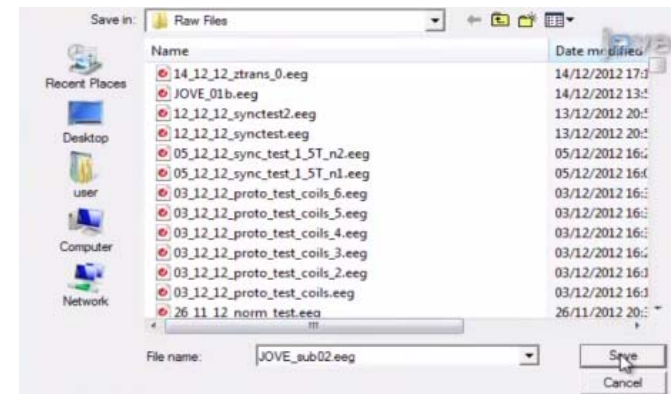
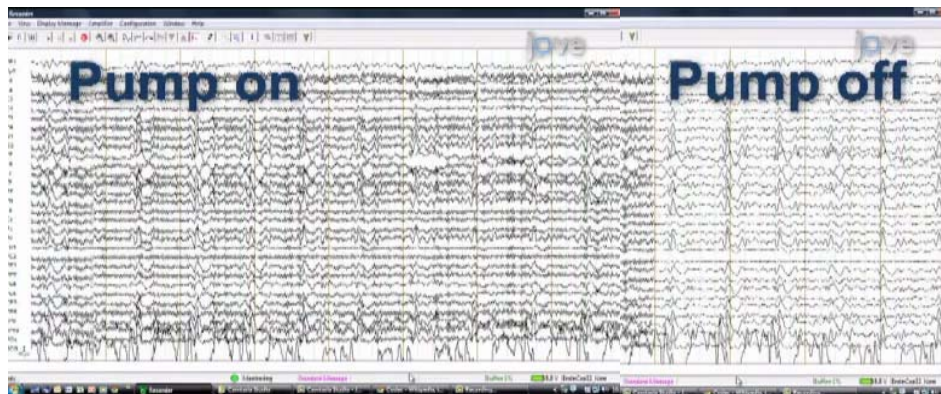
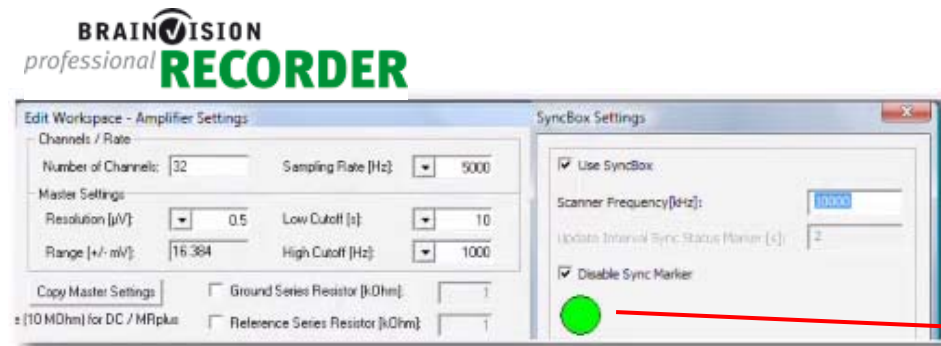


Mullinger et al. 2013, University of Nottingham

# 1. Data Acquisition

## The procedure in brief

- **Connect hardware:** amplifiers (via fiber optic cables), EEG acquisition laptop, MR scanner, and stimulus computer (via sync box)
- **Run experiment:** anatomical MR, check EEG signal, check synchronization, turn off cryo pumps, start EEG recording, start paradigm and fMRI acquisition, check MR and event markers in EEG



## Outline

1. Data Acquisition

2. Data Preprocessing

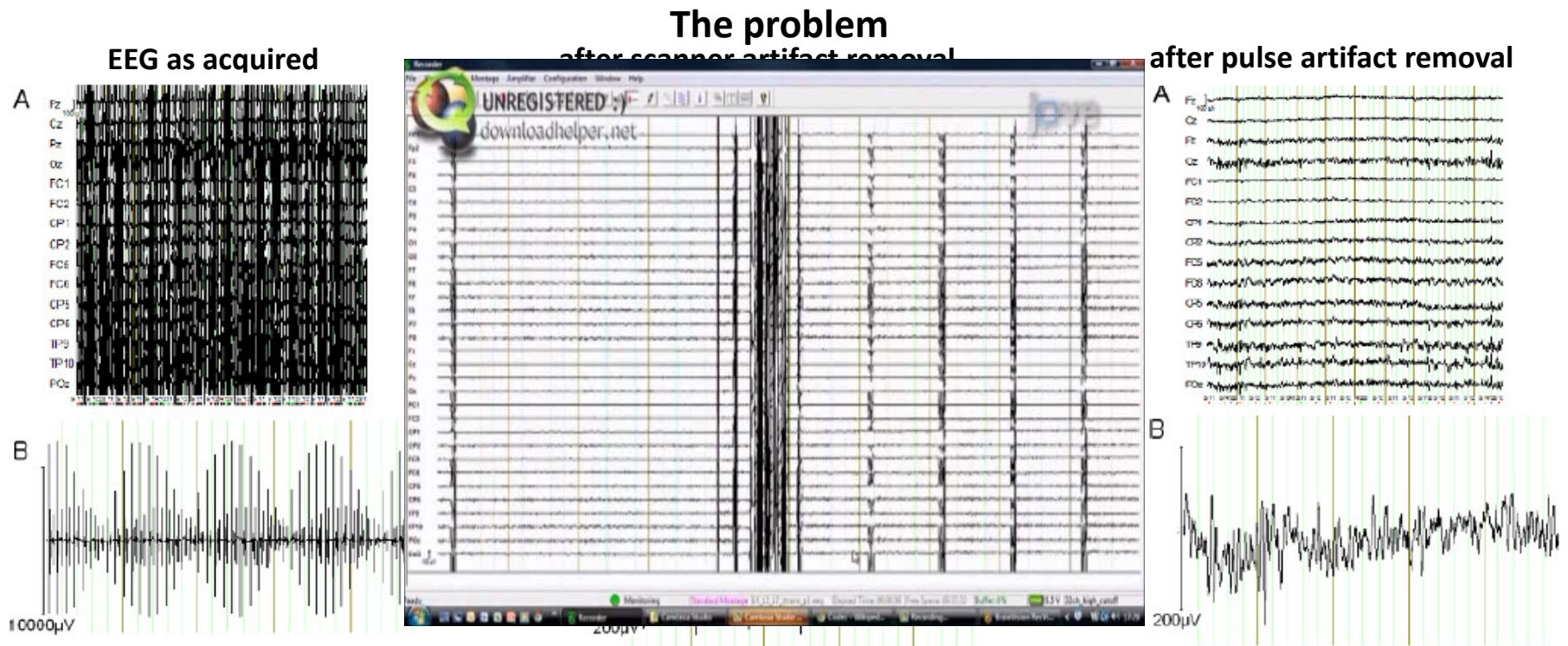
3. Data Integration

4. Benefits and Limitations



## 2. Data Preprocessing

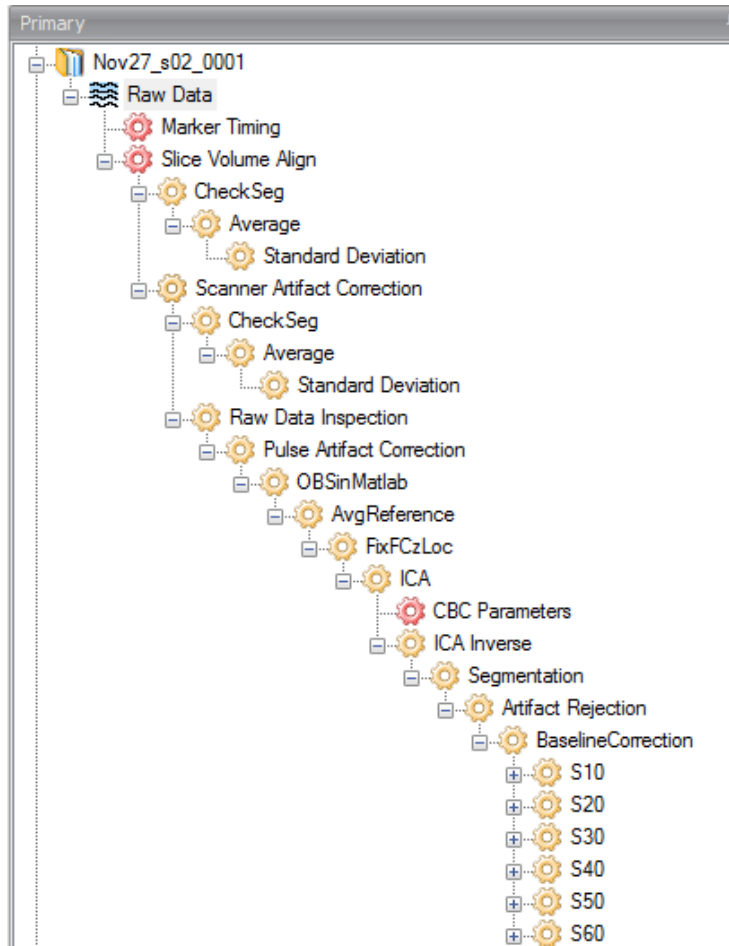
Regular for fMRI, special for EEG



Mullinger et al. 2013

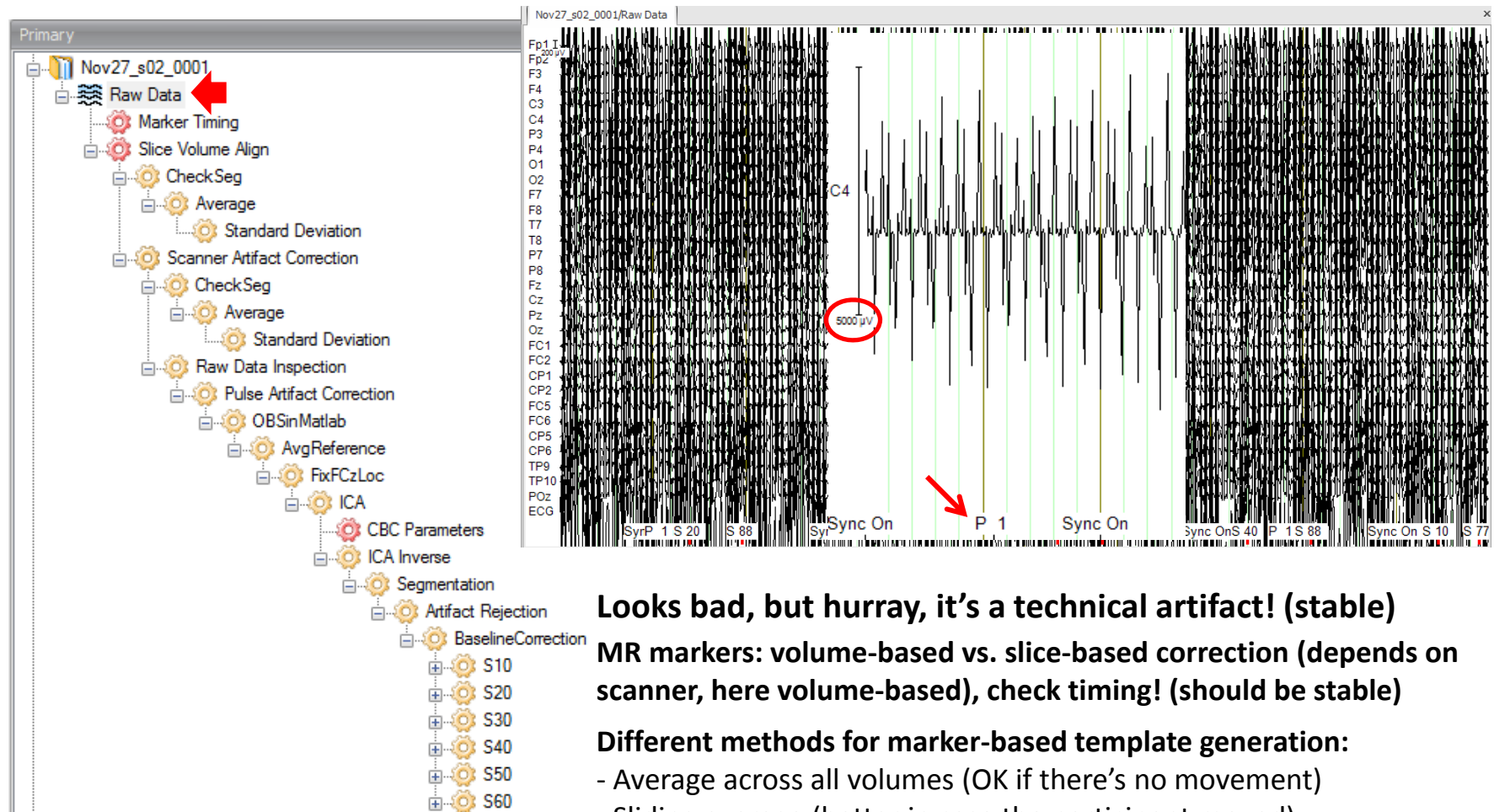
# 2. Data Preprocessing

## EEG preprocessing single subject



## 2. Data Preprocessing

### Scanner artifact correction



**Looks bad, but hurray, it's a technical artifact! (stable)**

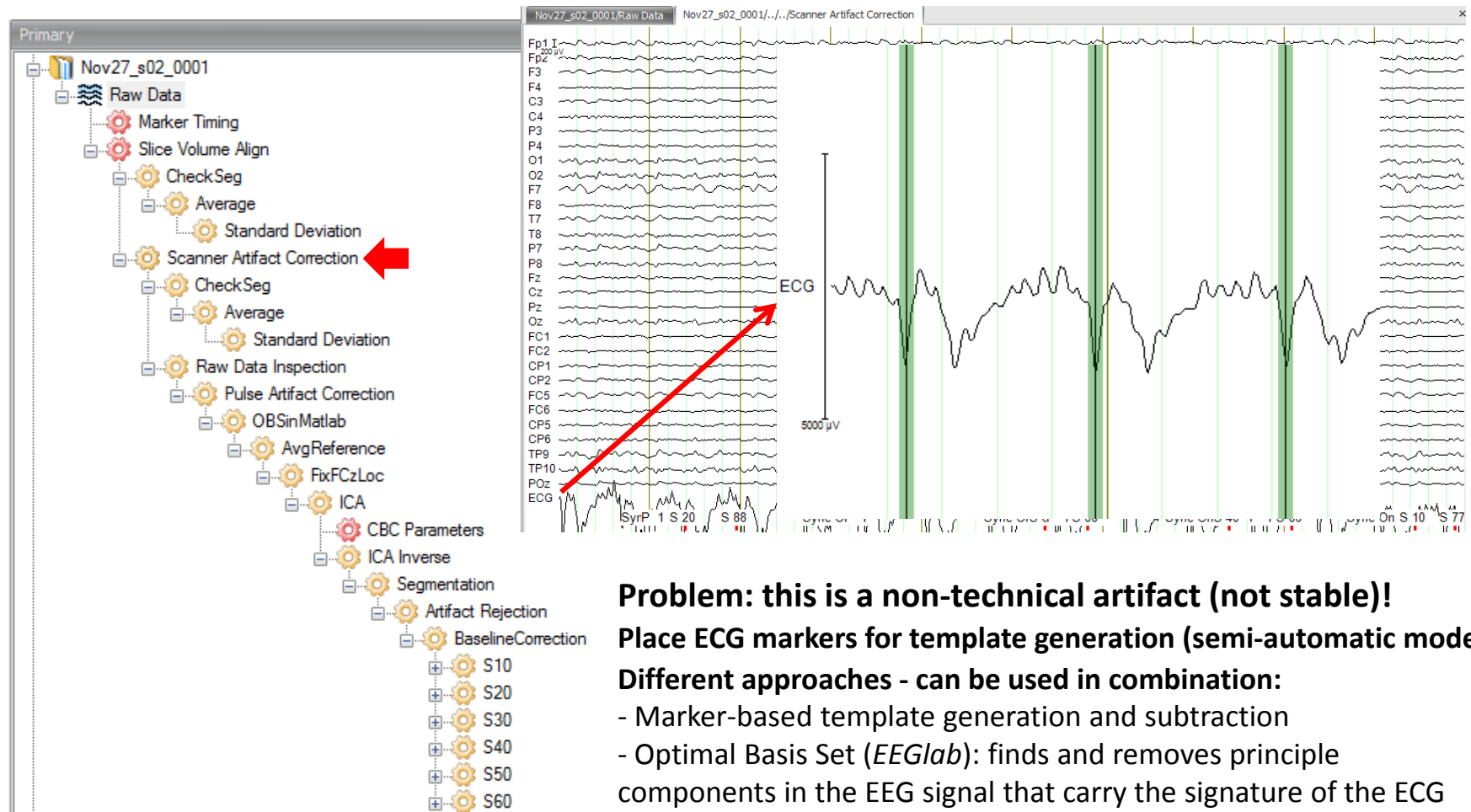
**MR markers: volume-based vs. slice-based correction (depends on scanner, here volume-based), check timing! (should be stable)**

**Different methods for marker-based template generation:**

- Average across all volumes (OK if there's no movement)
- Sliding average (better in case the participant moved)
- Average across selected volumes (if there are known bad volumes)

## 2. Data Preprocessing

### Pulse (cardio) artifact correction



**Problem: this is a non-technical artifact (not stable)!**

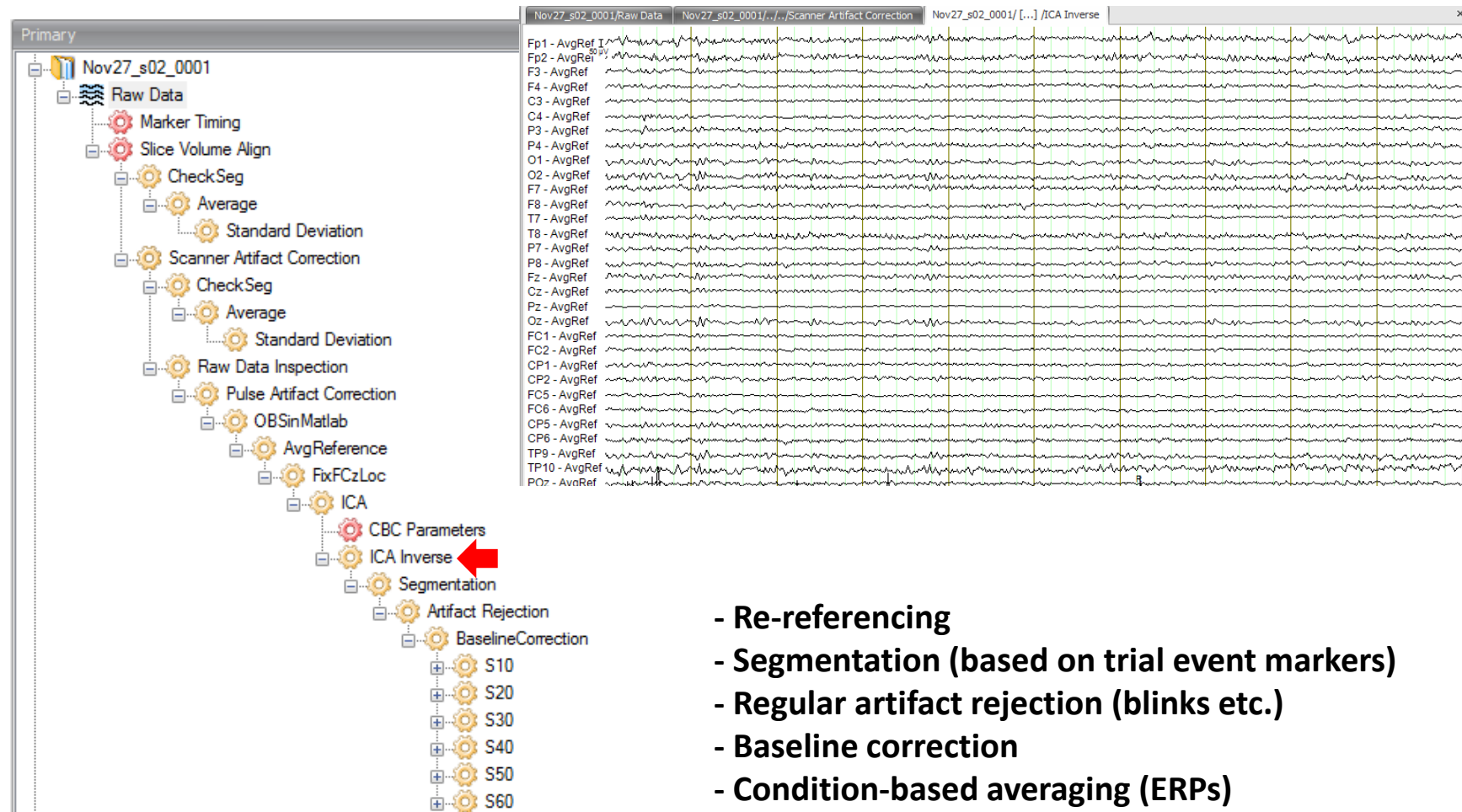
**Place ECG markers for template generation (semi-automatic mode!)**

**Different approaches - can be used in combination:**

- Marker-based template generation and subtraction
- Optimal Basis Set (*EEGlab*): finds and removes principle components in the EEG signal that carry the signature of the ECG
- ICA and inverse ICA (*Analyzer*): decomposition into ICs, suggesting ECG-related ICs, removal of those ICs (after visual inspection!)

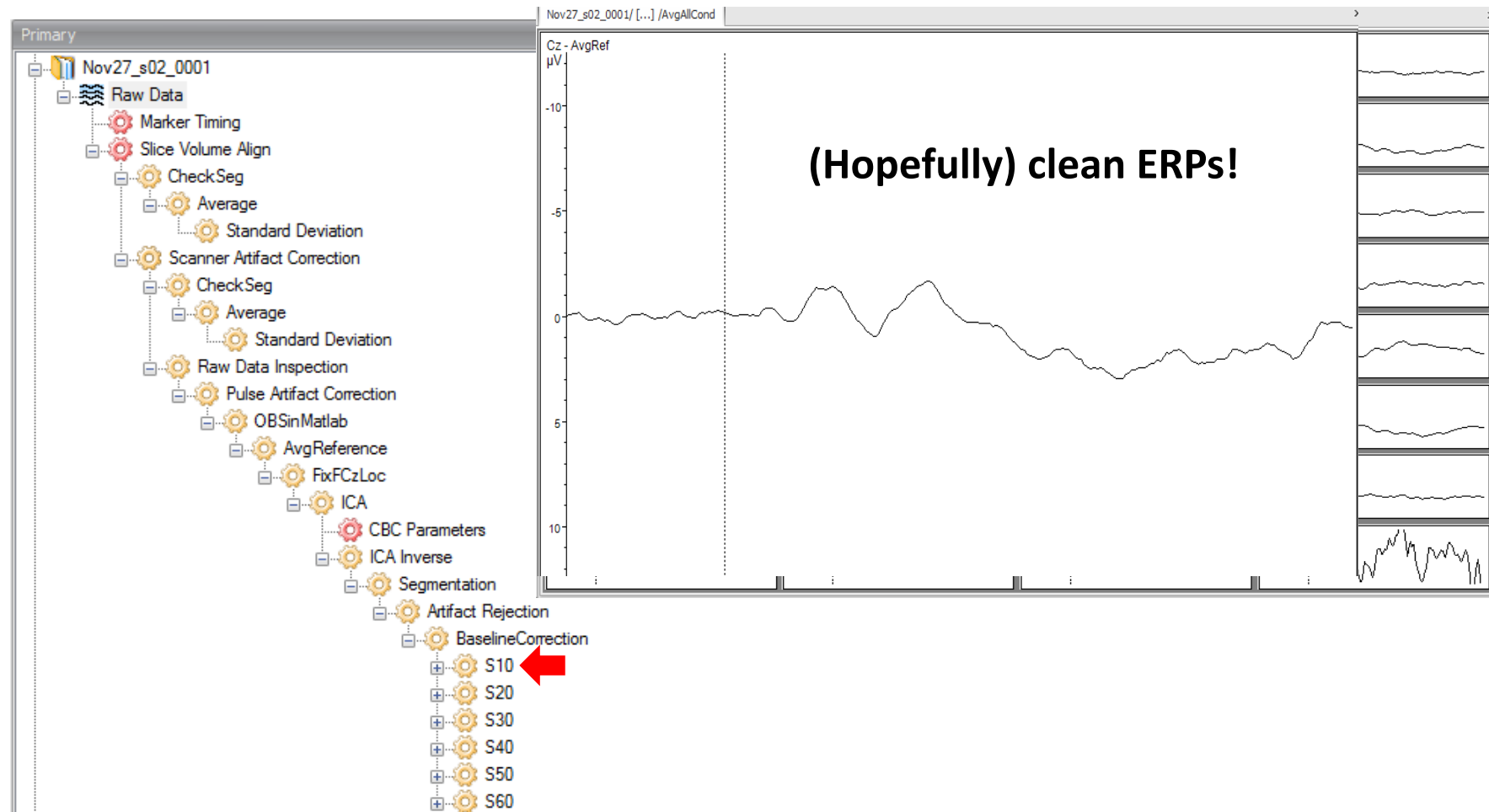
## 2. Data Preprocessing

### After artifact correction: From continuous EEG to ERPs



## 2. Data Preprocessing

### After artifact correction: From continuous EEG to ERPs



## Outline

1. Data Acquisition

2. Data Preprocessing

3. Data Integration

4. Benefits and Limitations

# 3. Data Integration

## Two data sets per participant

	<u>fMRI</u>	<u>EEG</u>
<b>Pre-processing</b>	Coregistration Slice-time correction Realignment Normalization Smoothing	MR and pulse artifact correction Re-referencing Segmentation Regular artefact rejection (blinks etc.) Baseline correction
<b>1<sup>st</sup> level (subject)</b>	Condition-based BOLD averaging (General Linear Model, GLM) ICA Functional connectivity	Condition-based averaging (amplitude or oscillatory power) ICA Source reconstruction
<b>2<sup>nd</sup> level (group)</b>	Across-subject averaging and stats (voxel-wise analysis, ROI, ICA, functional connectivity)	Across-subject averaging and stats (ERPs, amplitude and latency, topography, ICA, frequencies)



# 3. Data Integration

## 3.1 Treat as separate data sets. Get two experiments for the price of one.

	<b><u>fMRI</u></b>	<b><u>EEG</u></b>
<b>Pre-processing</b>	Coregistration Slice-time correction Realignment Normalization Smoothing	MR and pulse artifact correction Re-referencing Segmentation Regular artefact rejection (blinks etc.) Baseline correction
<b>1<sup>st</sup> level (subject)</b>	Condition-based BOLD averaging (General Linear Model, GLM) ICA Functional connectivity	Condition-based averaging (amplitude or oscillatory power) ICA Source reconstruction
<b>2<sup>nd</sup> level (group)</b>	Across-subject averaging and stats (voxel-wise analysis, ROI, ICA, functional connectivity)	Across-subject averaging and stats (ERPs, amplitude and latency, topography, ICA, frequencies)

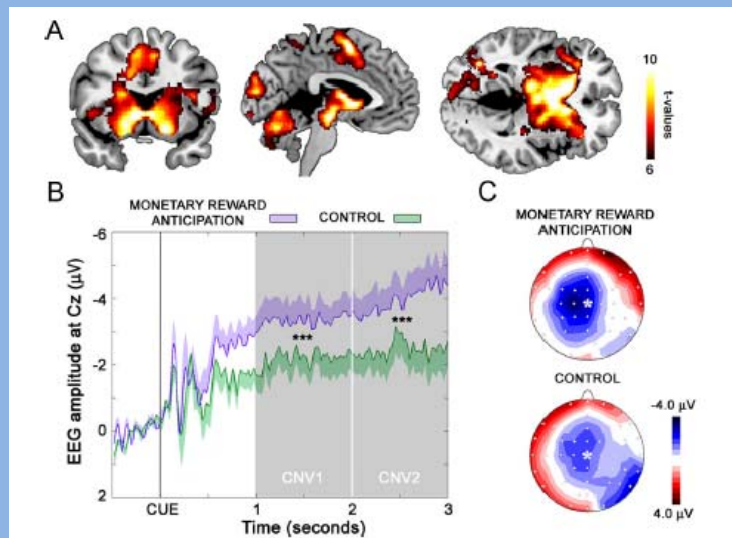
# 3. Data Integration

**3.2 Covariation of EEG and fMRI activity.** Use averaged EEG measure (amplitude or oscillatory power) as covariate in 2<sup>nd</sup> level fMRI analysis or correlate directly with BOLD signal.

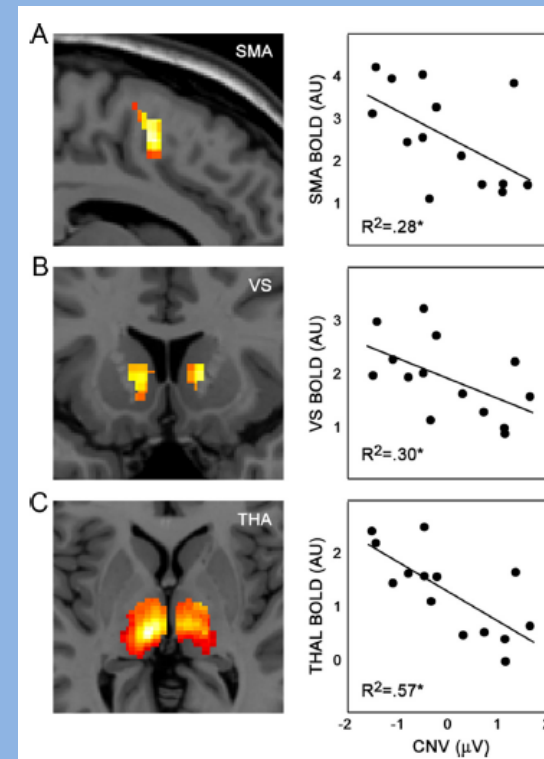
## Example:

**Plichta et al. 2013 (*JNeurosci*)**

average CNV during reward anticipation is correlated with averaged BOLD activity in the supplementary motor area, striatum, and thalamus (across trials)



One across-subject covariate (CNV):



(Examples: Liebenthal et al. 2003; Plichta et al. 2013)

# 3. Data Integration

**3.3 fMRI-informed EEG source localization.** Especially useful in clinical contexts. In fact, the origin of simultaneous fMRI/EEG lies in epilepsy treatment.

	<b><u>fMRI</u></b>	<b><u>EEG</u></b>
<b>Pre-processing</b>	Coregistration Slice-time correction Realignment Normalization Smoothing	MR and pulse artifact correction Re-referencing Segmentation Regular artefact rejection (blinks etc.) Baseline correction
<b>1<sup>st</sup> level (subject)</b>	Condition-based BOLD averaging (General Linear Model, GLM) ICA Functional connectivity	Condition-based averaging (amplitude or oscillatory power) ICA Source reconstruction
<b>2<sup>nd</sup> level (group)</b>	Across-subject averaging and stats (voxel-wise analysis, ROI, ICA, functional connectivity)	Across-subject averaging and stats (ERPs, amplitude and latency, topography, ICA, frequencies)

*dipole seeds* →

(Examples: Lemieux et al. 2004; Vanni et al. 2004; Grouiller et al. 2011)

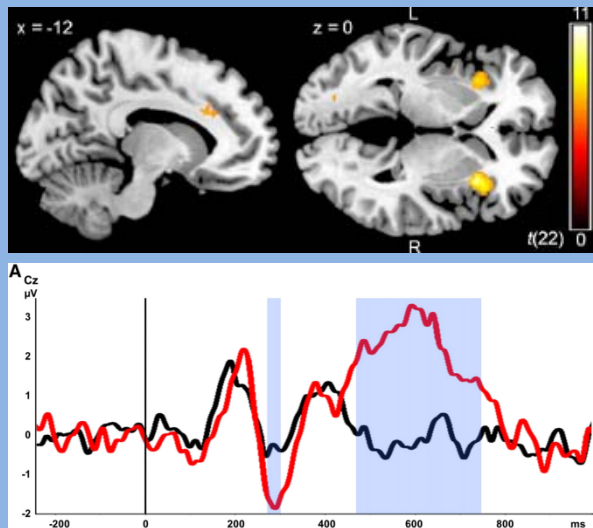
# 3. Data Integration

**3.4 EEG-informed fMRI analysis.** Use single-trial EEG measure (amplitude or oscillatory power) as parametric modulator in 1<sup>st</sup>-level fMRI model and test at 2<sup>nd</sup> level (additional variance?).

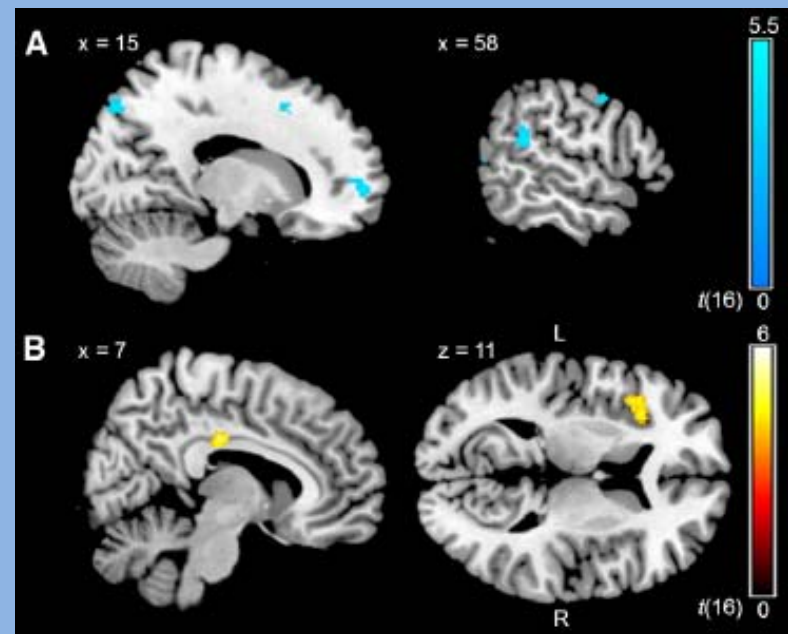
## Example:

### **Baumeister et al. 2014 (*NeuroImage*)**

N2 and P3 amplitudes during response inhibition are anti-correlated and correlated with the BOLD signal in distinct regions on a trial-to-trial basis



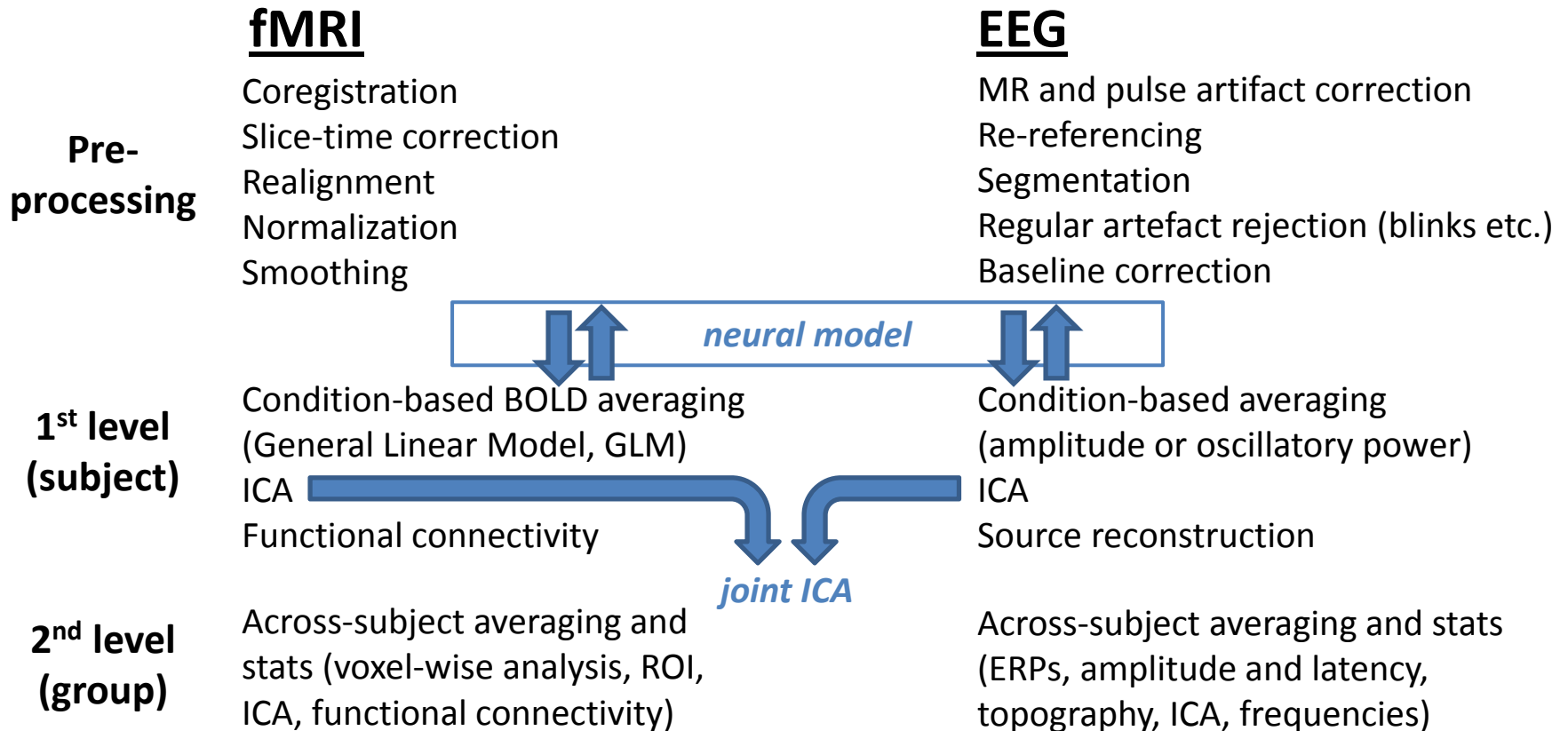
### Two single-trial parametric modulators (N2, P3):



(Examples: Debener et al. 2005; Benar et al. 2007; Scheeringa et al. 2009; Nguyen et al. 2014; Baumeister et al. 2014)

# 3. Data Integration

3.5 Symmetrical integration of fMRI/EEG data. e.g. joint ICA (data-driven, integrated spatiotemporal ICs) and complex neural models (model-based, integration of multiple levels).



(Examples: Valdes-Sosa et al. 2009; Mijovic et al. 2014)

## Outline

1. Data Acquisition

2. Data Preprocessing

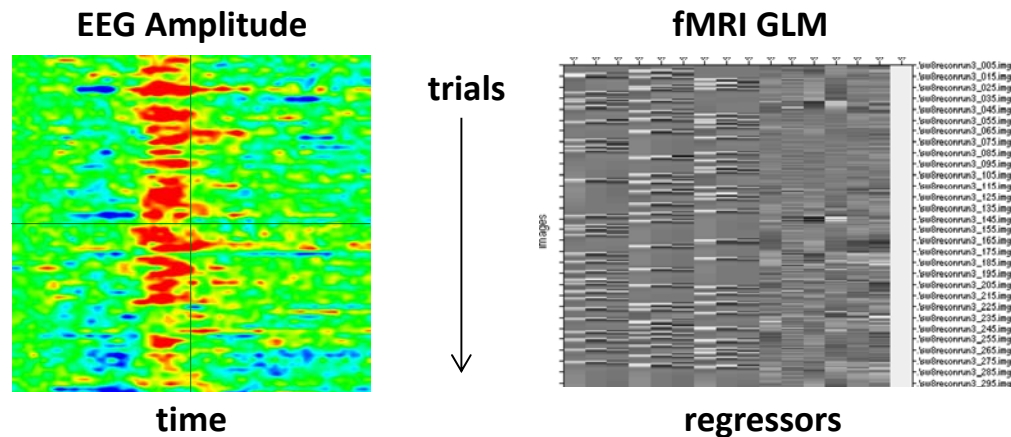
3. Data Integration

4. Benefits and Limitations

# 4. Benefits and Limitations

## Benefits (presuming good data quality and sufficient power!)

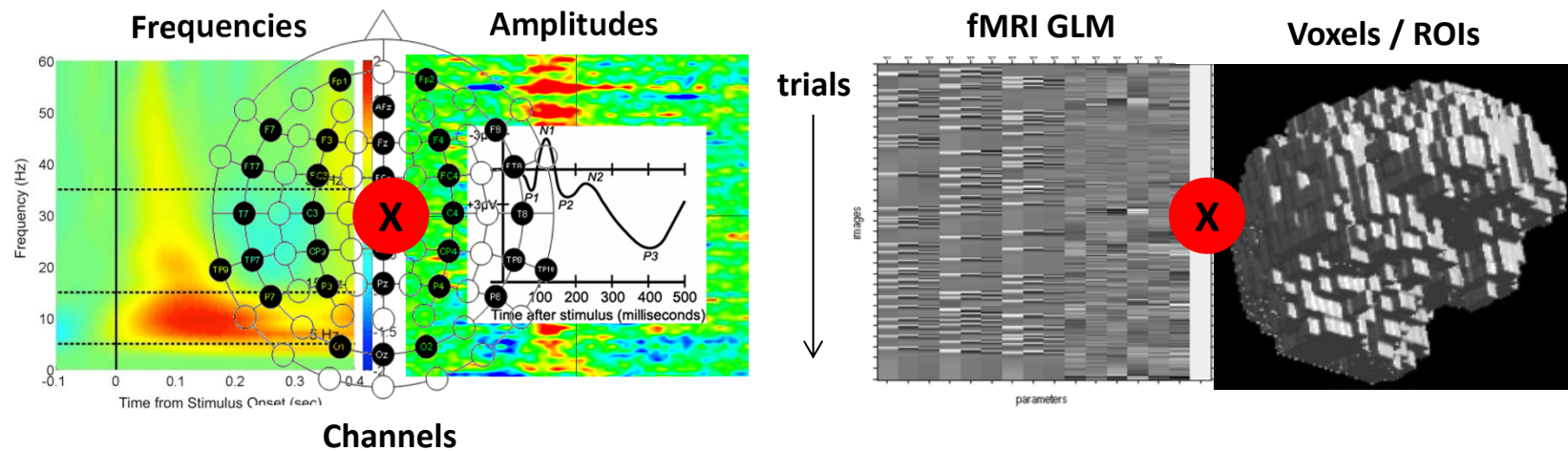
- Simultaneous fMRI/EEG is favorable compared to separate data sets, even if those were acquired in the same participant:
  - no between-subject variance (obvious)
  - no order and practice effects
  - identical situation with respect to task performance, stimulus perception, body position, noise level, instruction /experimenter effects
- these aspects increase statistical power and ensure that differences between conditions in one measure are not due to differences between fMRI and EEG session
  
- Simultaneous fMRI/EEG allows trial-by-trial covariation of spatial and temporal signatures of condition-specific brain states, exceeding across-participant approaches
- the same logic applies to covariation analyses between neural activity and task performance



# 4. Benefits and Limitations

## Limitations (beyond practical and technical issues)

- Experimental limitations in both acquisition modalities due to compatibility issues (e.g., sub-optimal stimulus timing; special sequences may not be allowed)
  - The high number of degrees of freedom require good a priori hypotheses and adequate corrections for multiple comparisons
- well, let's consider this a luxury problem!





## 4. Benefits and Limitations

### Take home:

**Simultaneous fMRI/EEG is more complicated to set up,  
but you can get the best out of two worlds with just a little more effort.**

**In best case, the data can be related to one another (and to performance) to gain  
insights into both the WHERE and the WHEN of a specific cognitive process.**

**But: good hypotheses are all the more important here as degrees of freedom are  
very high! (if you correlate stuff wildly, you may find something by accident)**

# That's all!

## Useful references:

- Huster et al. 2012, *JNeuroscience* (review article data integration)
- Mullinger et al. 2013, *JOVE* (best practice data acquisition, incl. movie)
- Jorge et al. 2014, *NeuroImage* (review article data integration)
- Debener et al. 2006, *TICS* (opinion article single-trial analysis)