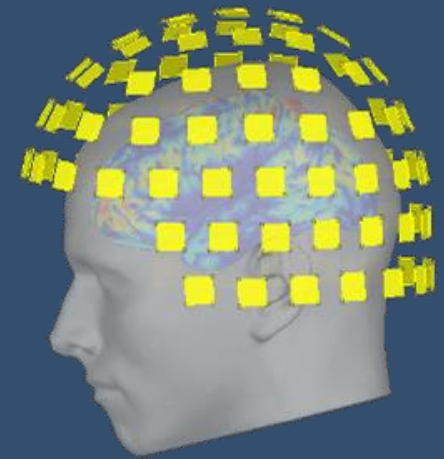
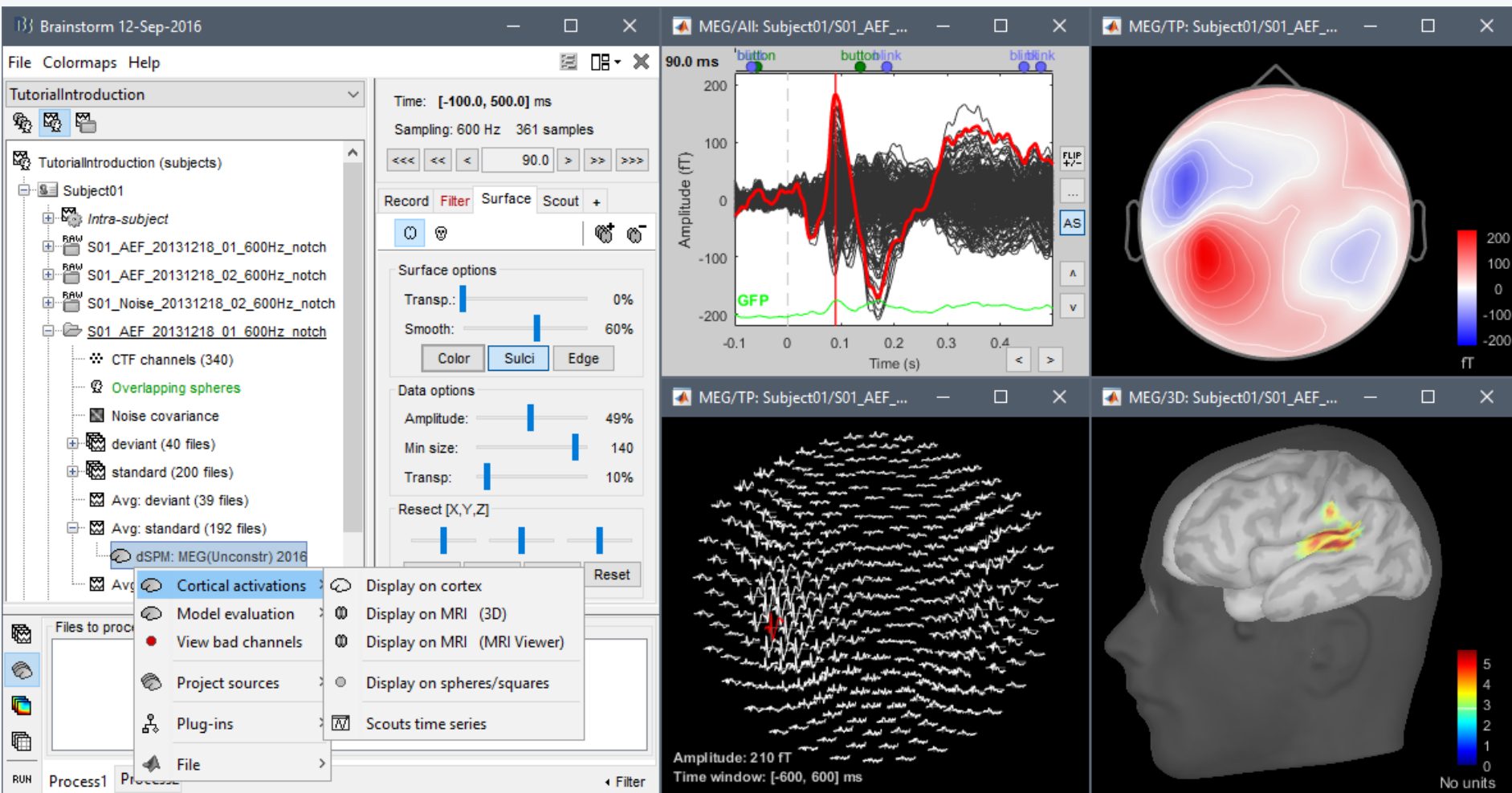


MEG and EEG analysis using  
**Brainstorm**  
<http://neuroimage.usc.edu/brainstorm>



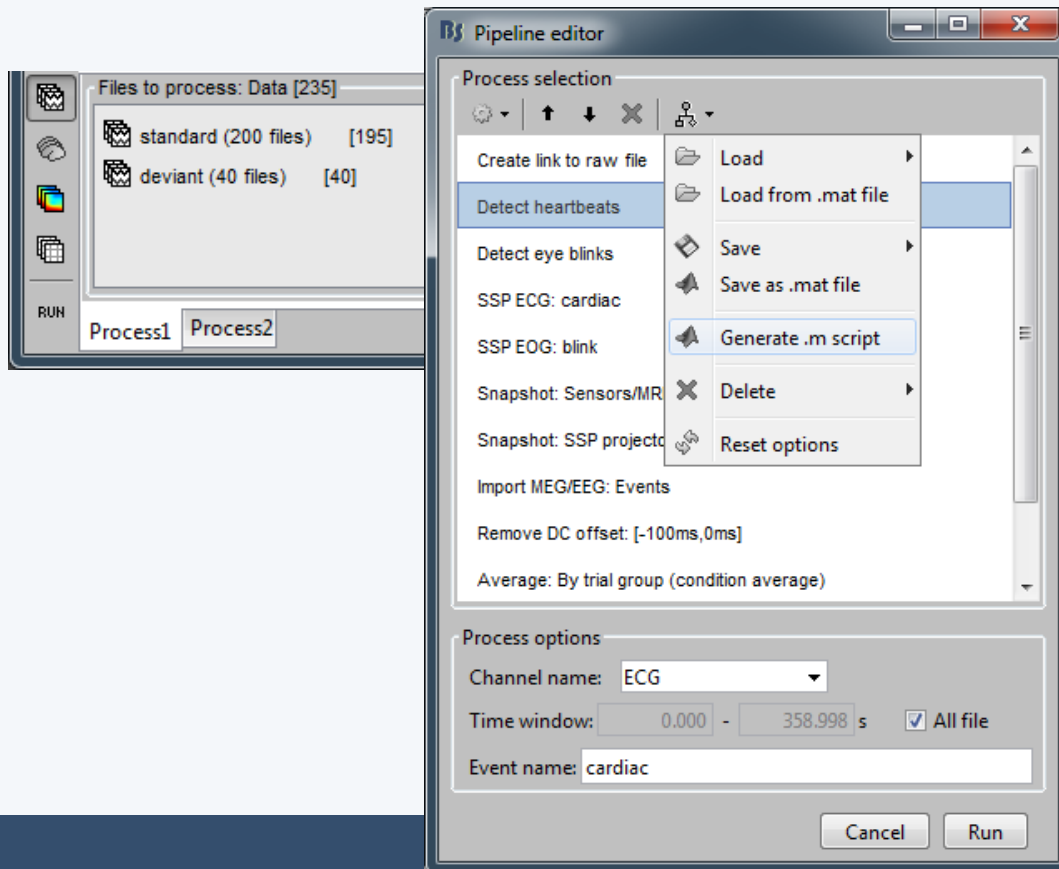
**April 2017**

# Graphic interface



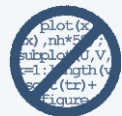
# Scripting environment

- Rapid selection of files and processes to apply
- Automatic generation of Matlab scripts
- Plug-in structure: easy to add custom processes



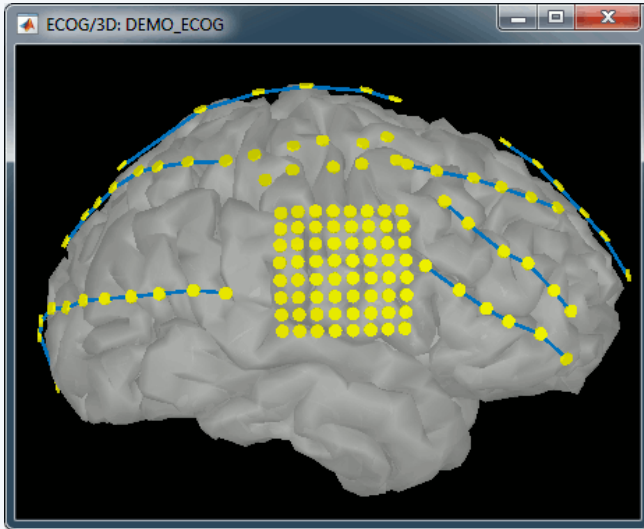
```
1 % Script generated by Brainstorm v3.1 (17-Dec-2010).
2 FileNamesA = {'Subject01\Left\data_average_101213_1558.mat', ...
3               'Subject01\Right\data_average_101213_1559.mat'};
4 FileNamesB = [];
5
6 % Process: Detect bad trials: Peak-to-peak MEGGRAD(0-2000)
7 sFiles = bst_process(...
8     'CallProcess', 'process_detectbad', ...
9     FileNamesA, FileNamesB, ...
10    'timewindow', [-0.0998, 0.3000], ...
11    'meggrad', {[0, 2000], 'fT/cm (x 0.04)', 1e-015}, ...
12    'rejectmode', 2);
13
14 % Process: Remove baseline: [-100ms,-1ms]
15 sFiles = bst_process(...
16     'CallProcess', 'process_baseline', ...
17     sFiles, [], ...
18     'baseline', [-0.09983, -0.00056], ...
19     'overwrite', 1);
20
21 % Process: Band-pass filter: 1Hz - 80Hz
22 sFiles = bst_process(...
23     'CallProcess', 'process_bandpass', ...
24     sFiles, [], ...
25     'f1', 1, ...
26     'f2', 80, ...
27     'overwrite', 1);
28
29 % Process: Average by condition
30 sFiles = bst_process(...
31     'CallProcess', 'process_average', ...
32     sFiles, [], ...
33     'avgttype', 3, ...
34     'isstd', 0);
```

- Free and open-source application
- Matlab & Java: Platform-independent
- Designed for Matlab
- Stand-alone version available
- Interface-based: click, drag, drop
- No programming experience required
- Daily updates of the software
- Supports most common file formats

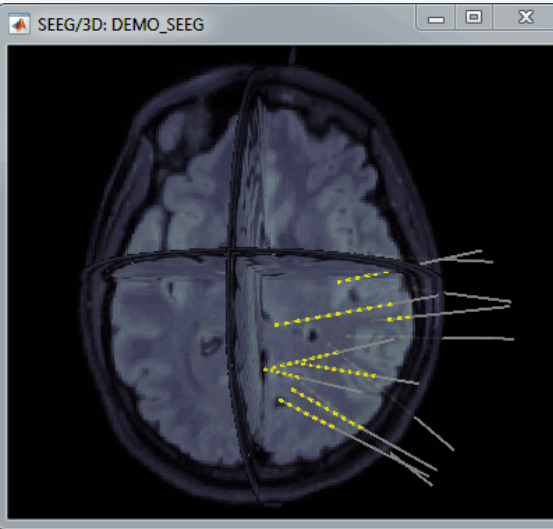


# Multi-modal imaging

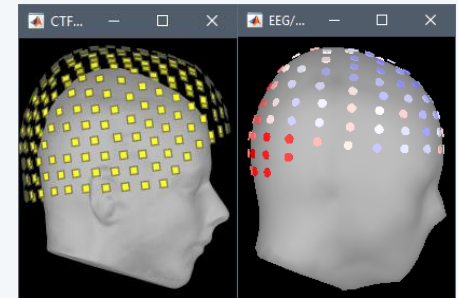
ECoG



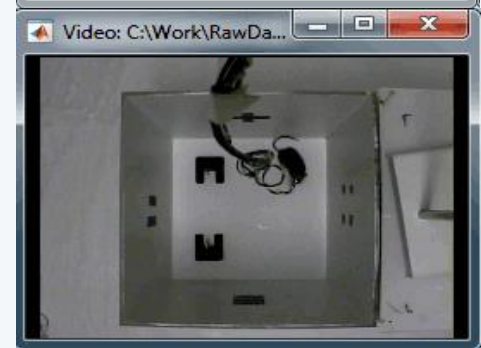
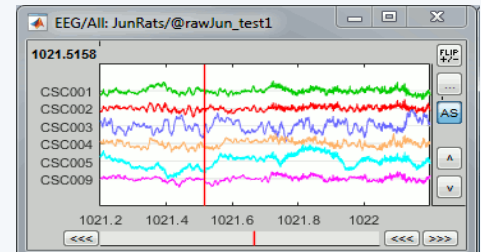
Depth electrodes



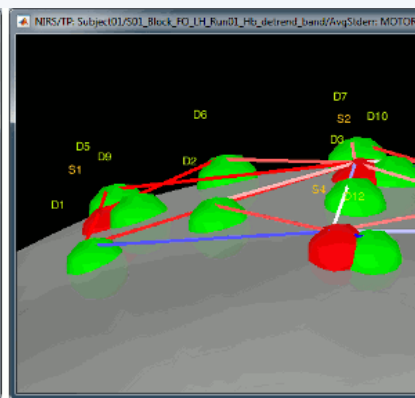
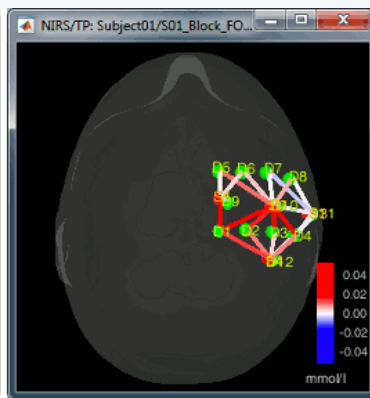
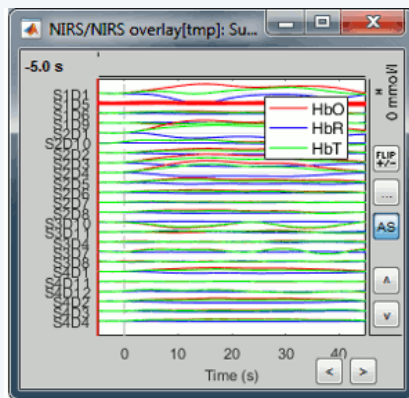
MEG/EEG



Electrophysiology

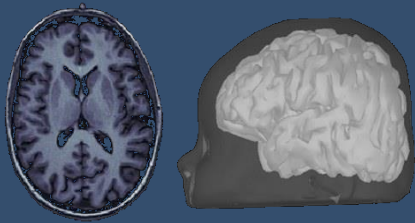


fNIRS

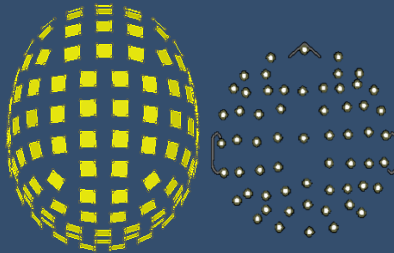


# Workflow

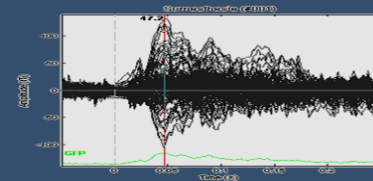
## Anatomy



## Sensors



## EEG/MEG



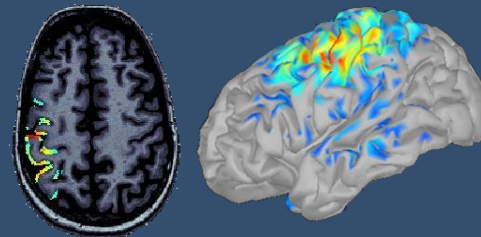
## Analysis

Averages  
Contrasts  
Group analysis  
Time-frequency  
Connectivity

## Co-registration



## Source estimation



# Single subject

Anatomy  
Link recordings  
MRI registration

## Importing

PSD  
Filters  
Bad channels  
Artifacts  
Correction  
Bad segments

## Pre-processing

Markers  
Epoching  
Averaging  
Sources  
Time-frequency

## Analysis of the experimental data

Loop:  
all acquisition runs  
all subjects

## Anatomy

Link recordings  
MRI registration

PSD

Filters

Bad channels

Artifacts

Correction

Bad segments

Markers

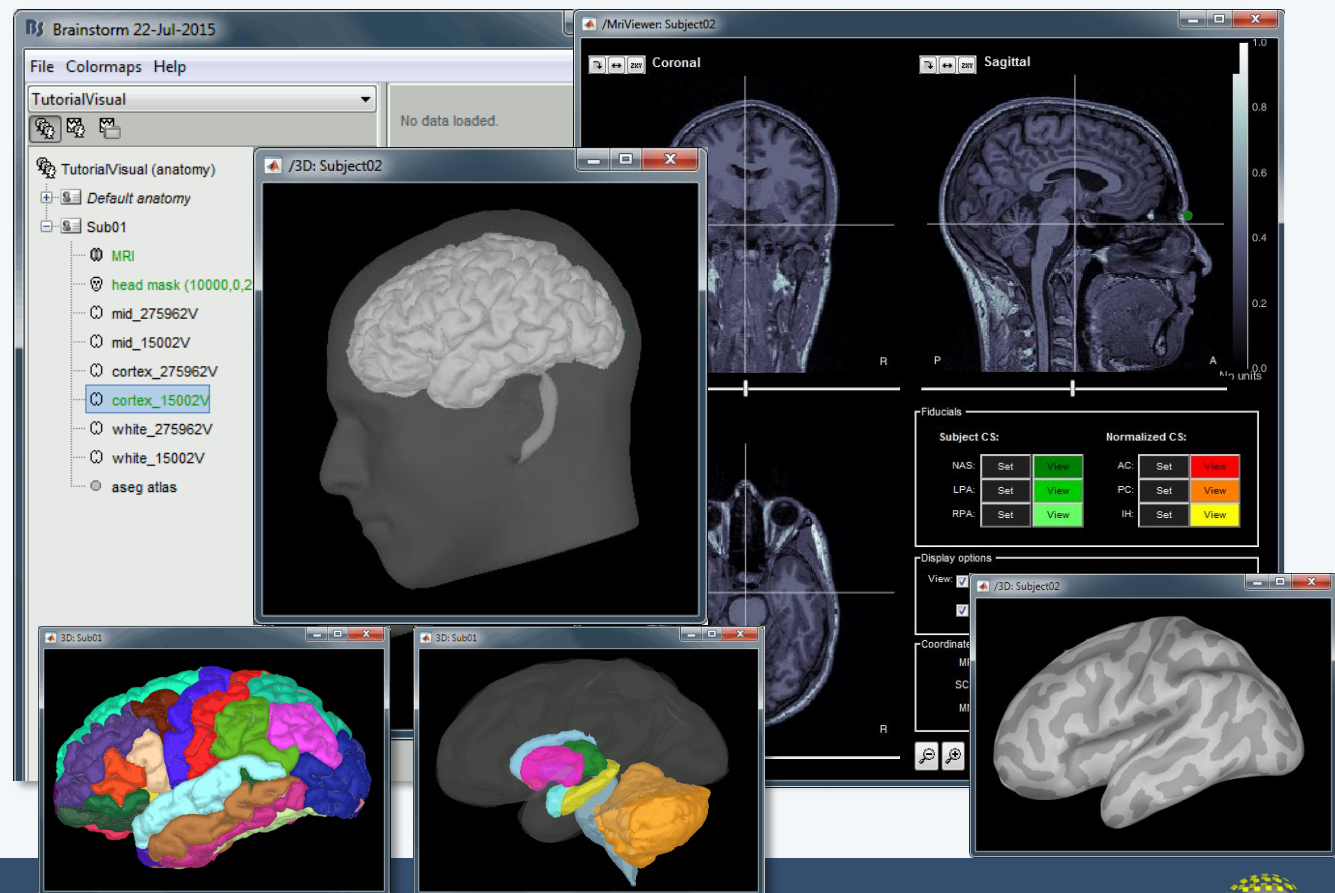
Epoching

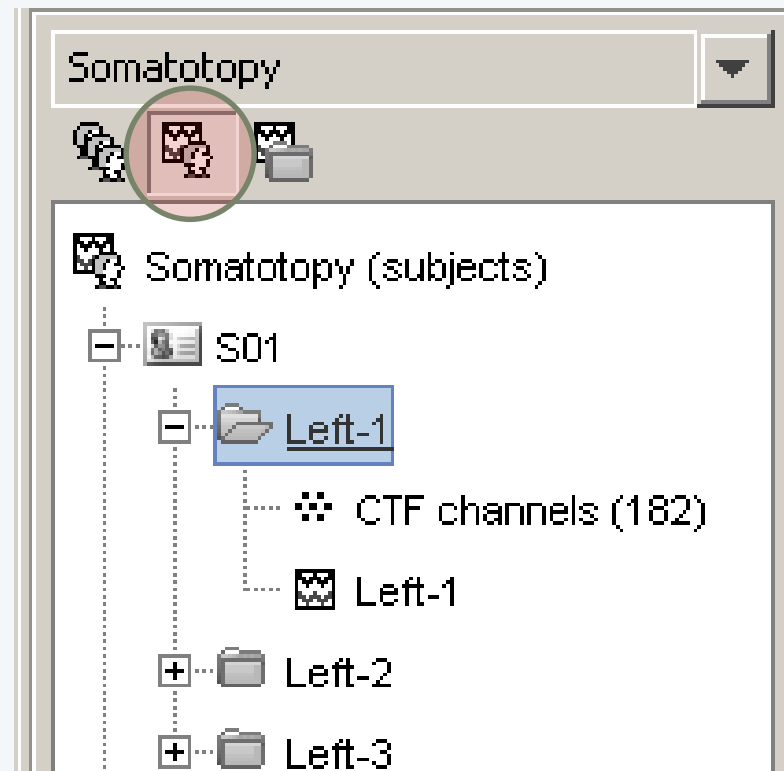
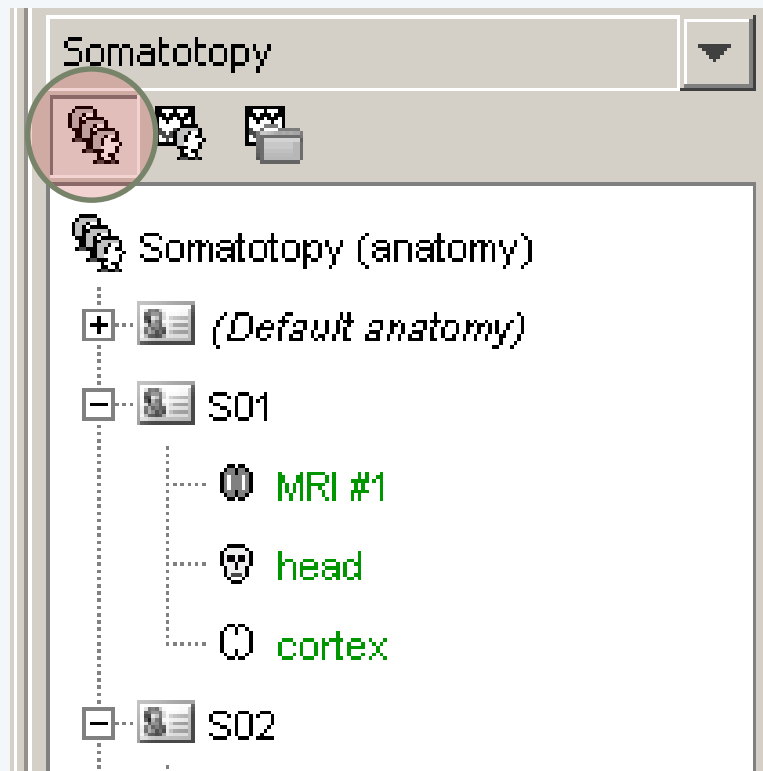
Averaging

Sources

Time-frequency

- One-click import of the T1 segmentation: FreeSurfer, BrainSuite, BrainVISA, CIVET
- Import and place fiducials in the MRI (N,L,R)





- Three levels:
  - Protocol
  - Subject
  - Condition
- Popup menus
- All files saved in Matlab .mat
- Same architecture on the disk

# Import

Anatomy

Link recordings

MRI registration

PSD

Filters

Bad channels

Artifacts

Correction

Bad segments

Markers

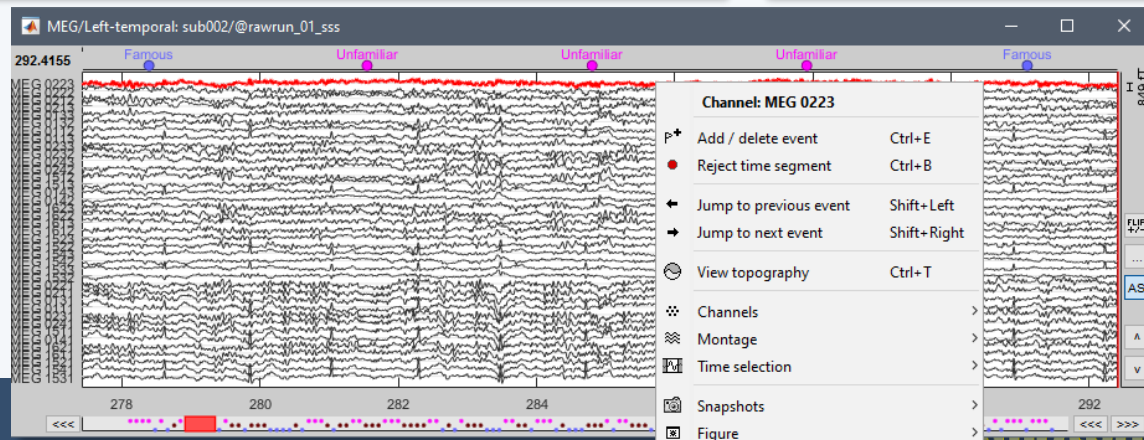
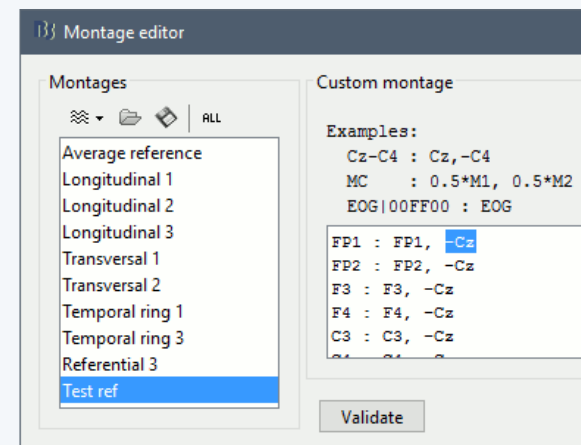
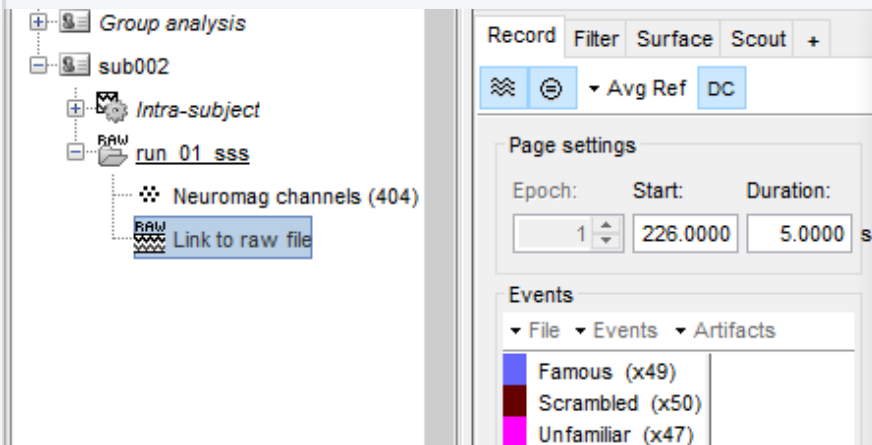
Epoching

Averaging

Sources

Time-frequency

- Original files linked to the database (no copy)
- Rich data viewer with flexible montage editor
- Optimized reading functions



# Co-registration MEG / MRI (I)

Anatomy

Link recordings

**MRI registration**

PSD

Filters

Bad channels

Artifacts

Correction

Bad segments

Markers

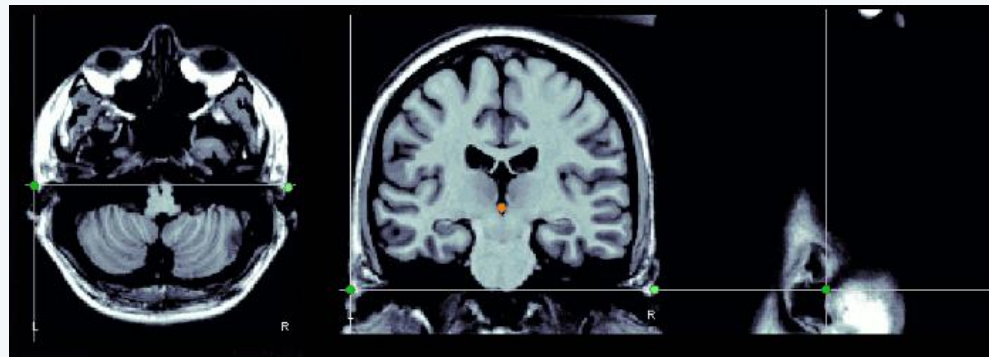
Epoching

Averaging

Sources

Time-frequency

- Basic estimation based on three points: Nasion (NAS), Left ear (LPA), Right ear (RPA)
- MRI: Marked in the volume with the MRI Viewer
- MEG: Obtained with a tracking system (Polhemus)



# Co-registration MEG / MRI (2)

Anatomy

Link recordings

**MRI registration**

PSD

Filters

Bad channels

Artifacts

Correction

Bad segments

Markers

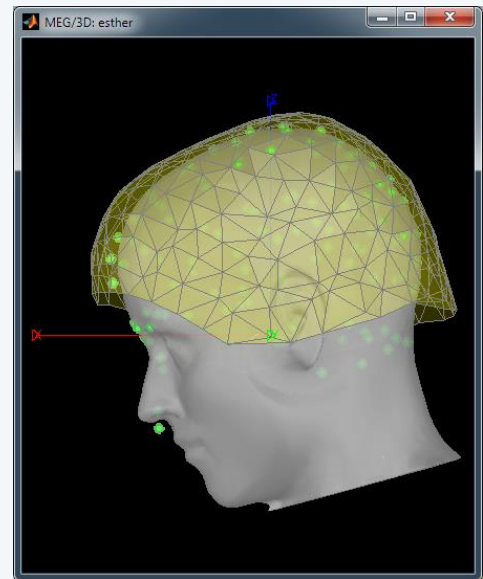
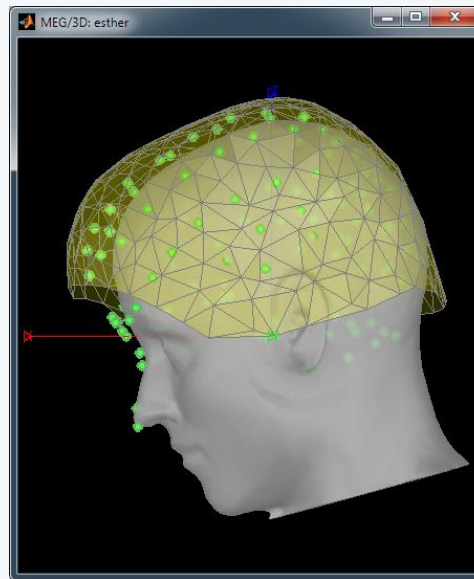
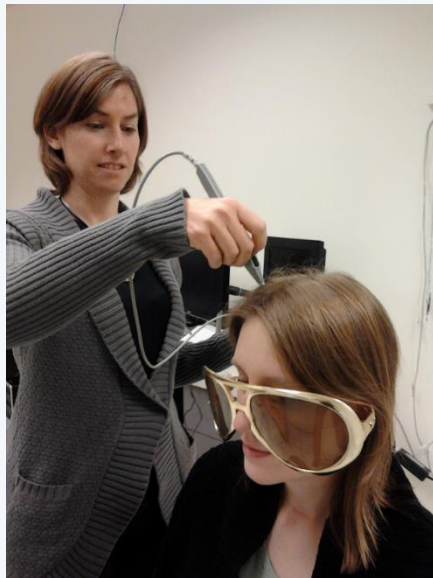
Epoching

Averaging

Sources

Time-frequency

- Automatic adjustment based on head shape: Fitting Polhemus points on the MRI head surface
- Final registration must be checked manually
- Polhemus driver included in Brainstorm



# Quality control

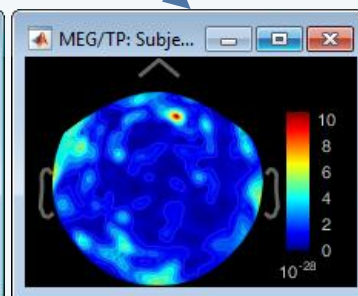
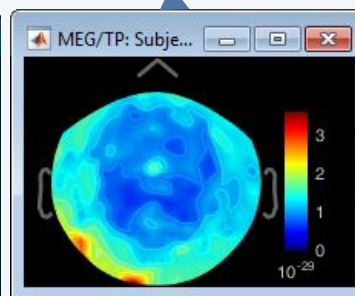
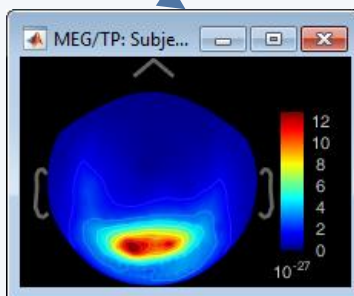
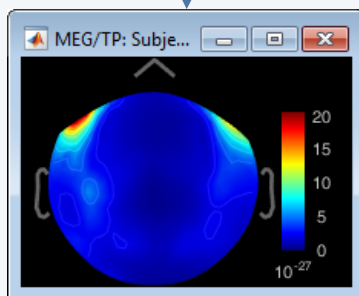
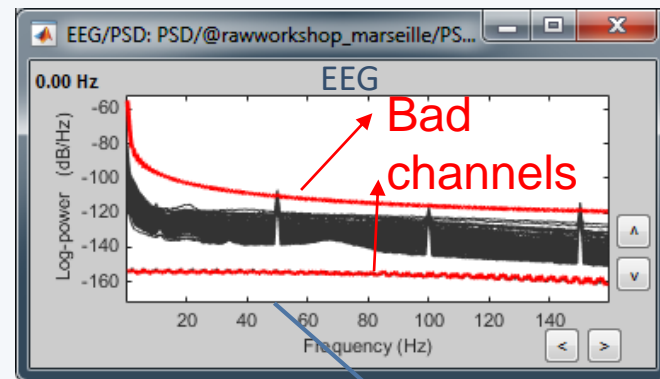
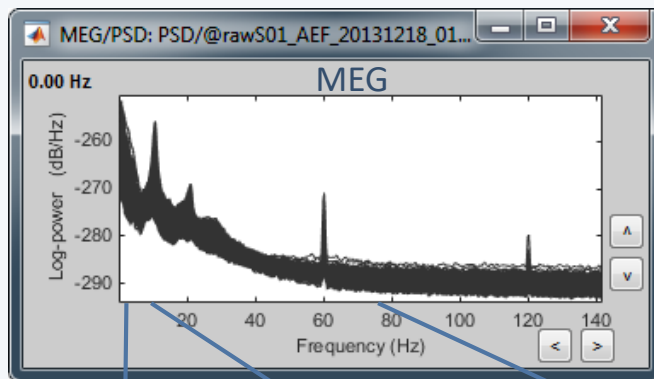
Anatomy  
Link recordings  
MRI registration

## PSD

Filters  
Bad channels  
Artifacts  
Correction  
Bad segments

Markers  
Epoching  
Averaging  
Sources  
Time-frequency

- Power spectrum density for quality control



# Pre-processing

Anatomy  
Link recordings  
MRI registration

PSD

## Filters

Bad channels  
Artifacts  
Correction  
Bad segments

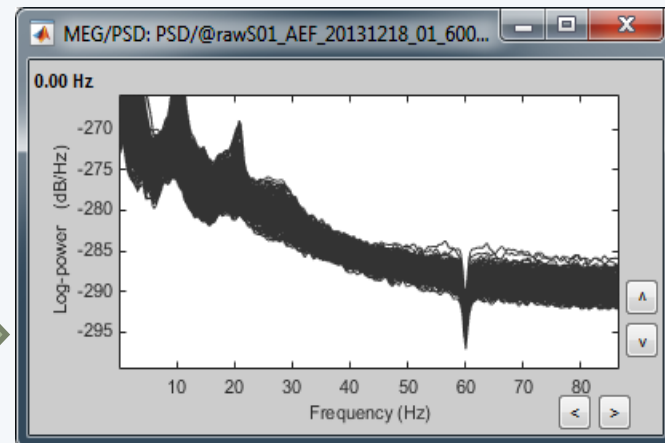
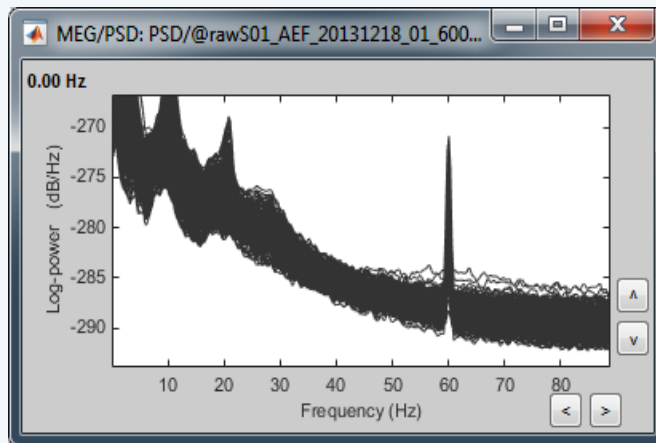
Markers

Epoching  
Averaging  
Sources

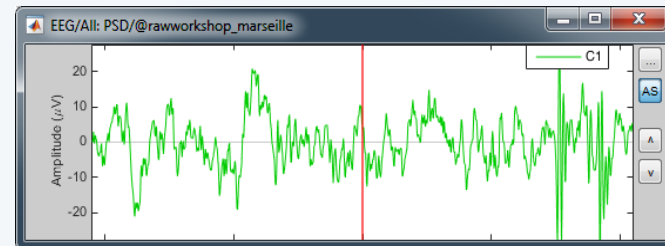
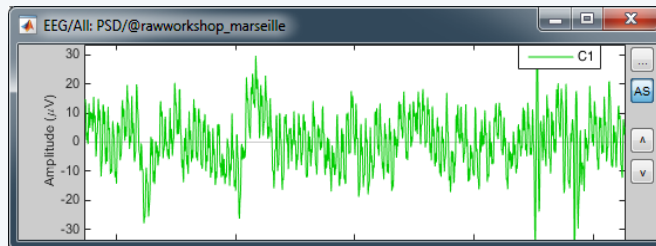
Time-frequency

- Notch filter: Removes 50Hz/60Hz power line noise (and harmonics)

PSD



Signal



# Pre-processing

Anatomy  
Link recordings  
MRI registration

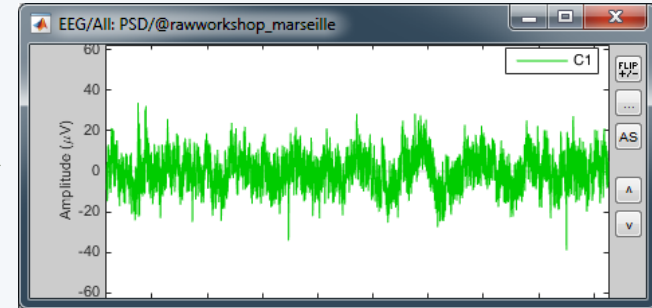
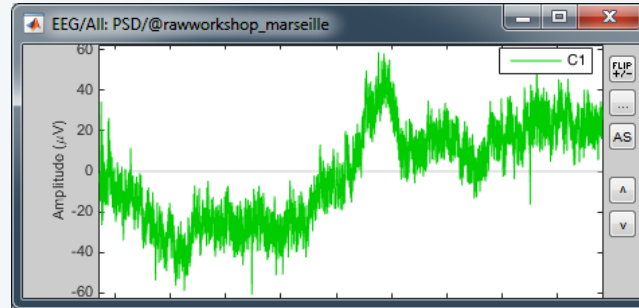
PSD

## Filters

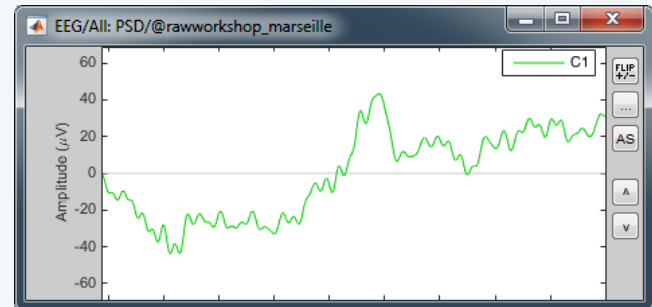
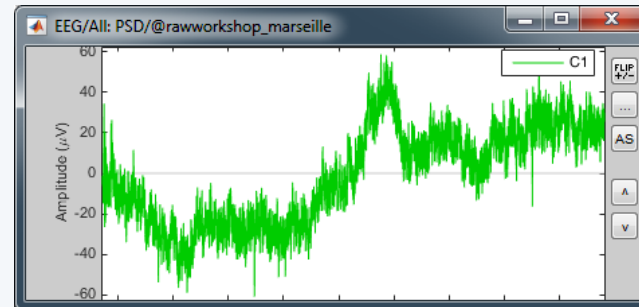
Bad channels  
Artifacts  
Correction  
Bad segments

Markers  
Epoching  
Averaging  
Sources  
Time-frequency

- High-pass filter: Removes slow components (eye movements, breathing, sensor drifts...)



- Low-pass filter: Remove high-frequencies



# Pre-processing

Anatomy  
Link recordings  
MRI registration

PSD

Filters

**Bad channels**

Artifacts

Correction

Bad segments

Markers

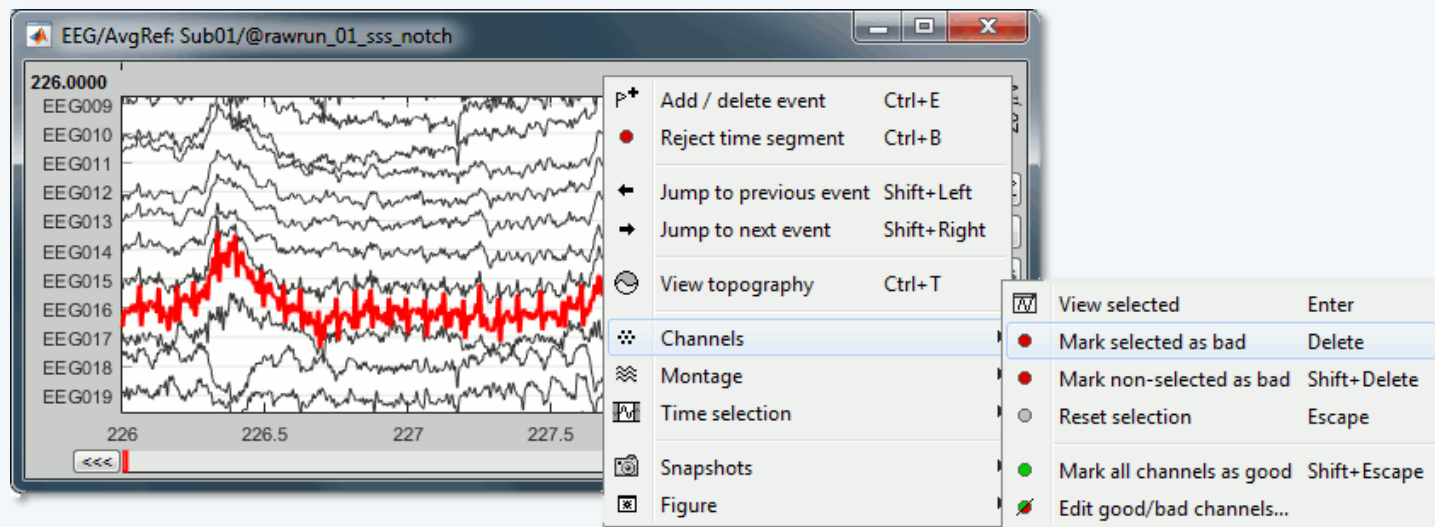
Epoching

Averaging

Sources

Time-frequency

- Manual inspection of the recordings
- Interactive selection of bad channels
- Re-reference the EEG if necessary (Average ref)



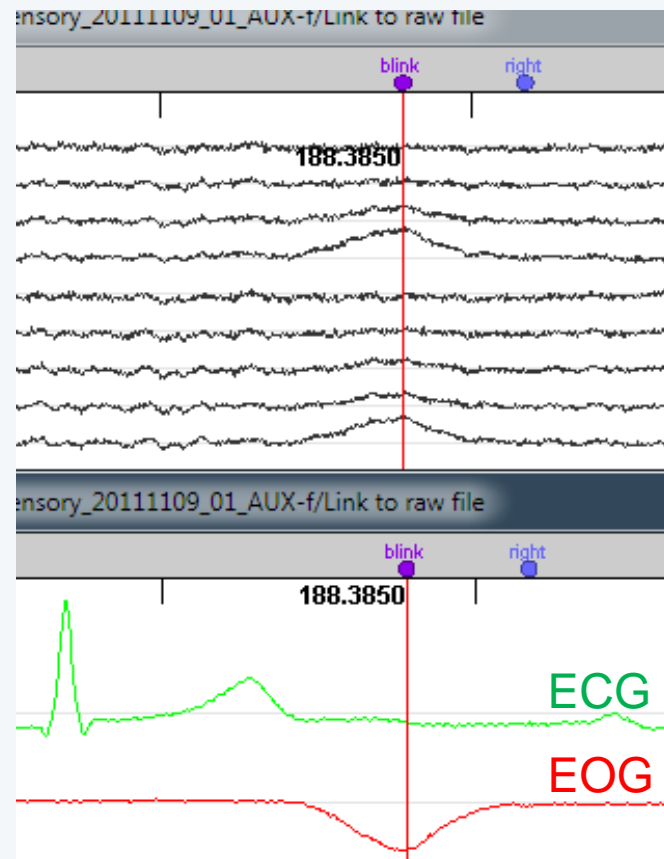
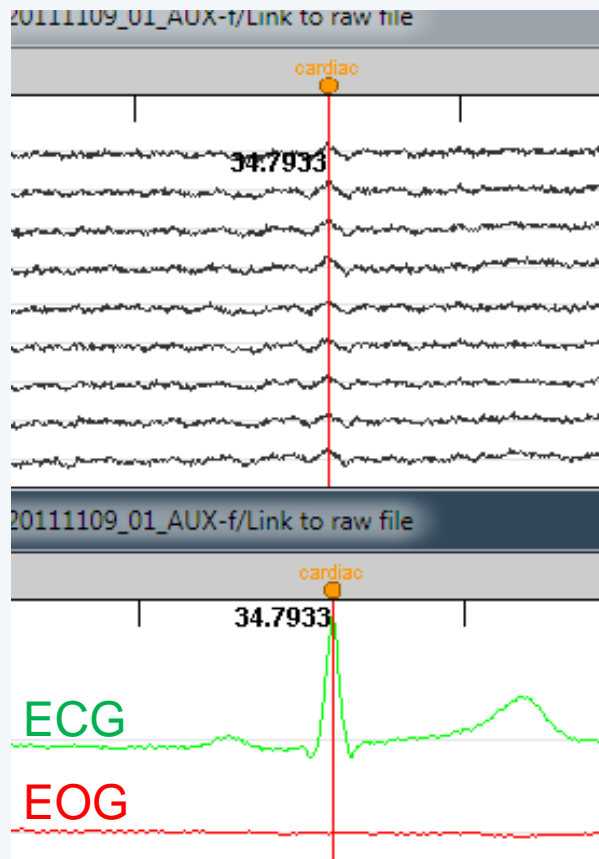
# Pre-processing

Anatomy  
Link recordings  
MRI registration

PSD  
Filters  
Bad channels  
**Artifacts**  
Correction  
Bad segments

Markers  
Epoching  
Averaging  
Sources  
Time-frequency

- Automatic detection of blinks and heartbeats (peak detection, or explicit amplitude threshold)



# Pre-processing

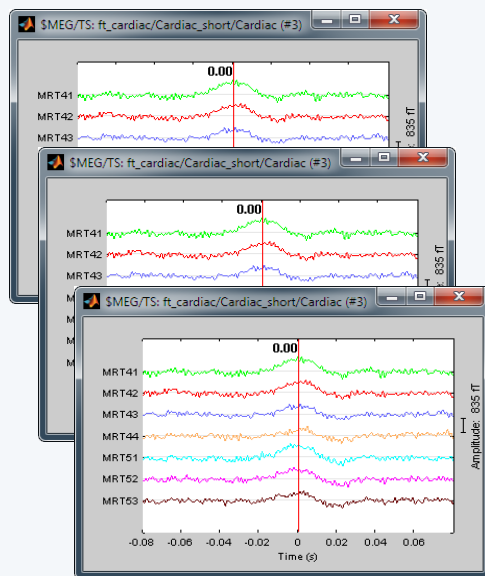
Anatomy  
Link recordings  
MRI registration

PSD  
Filters  
Bad channels  
Artifacts  
**Correction**  
Bad segments

Markers  
Epoching  
Averaging  
Sources  
Time-frequency

- Correction with Signal Space Projections (SSP)

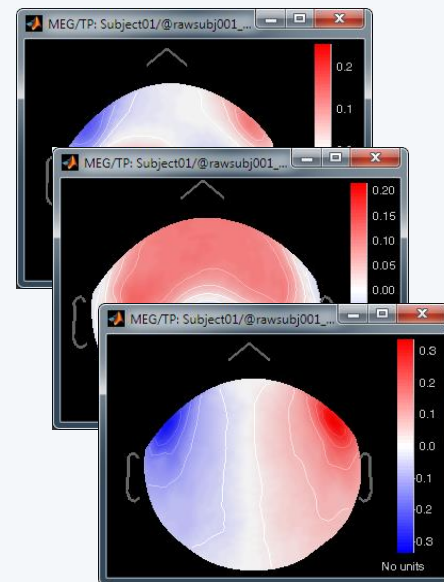
Detect artifacts



PCA



Spatial components



Select components and compute a linear projector to remove their contribution from the recordings

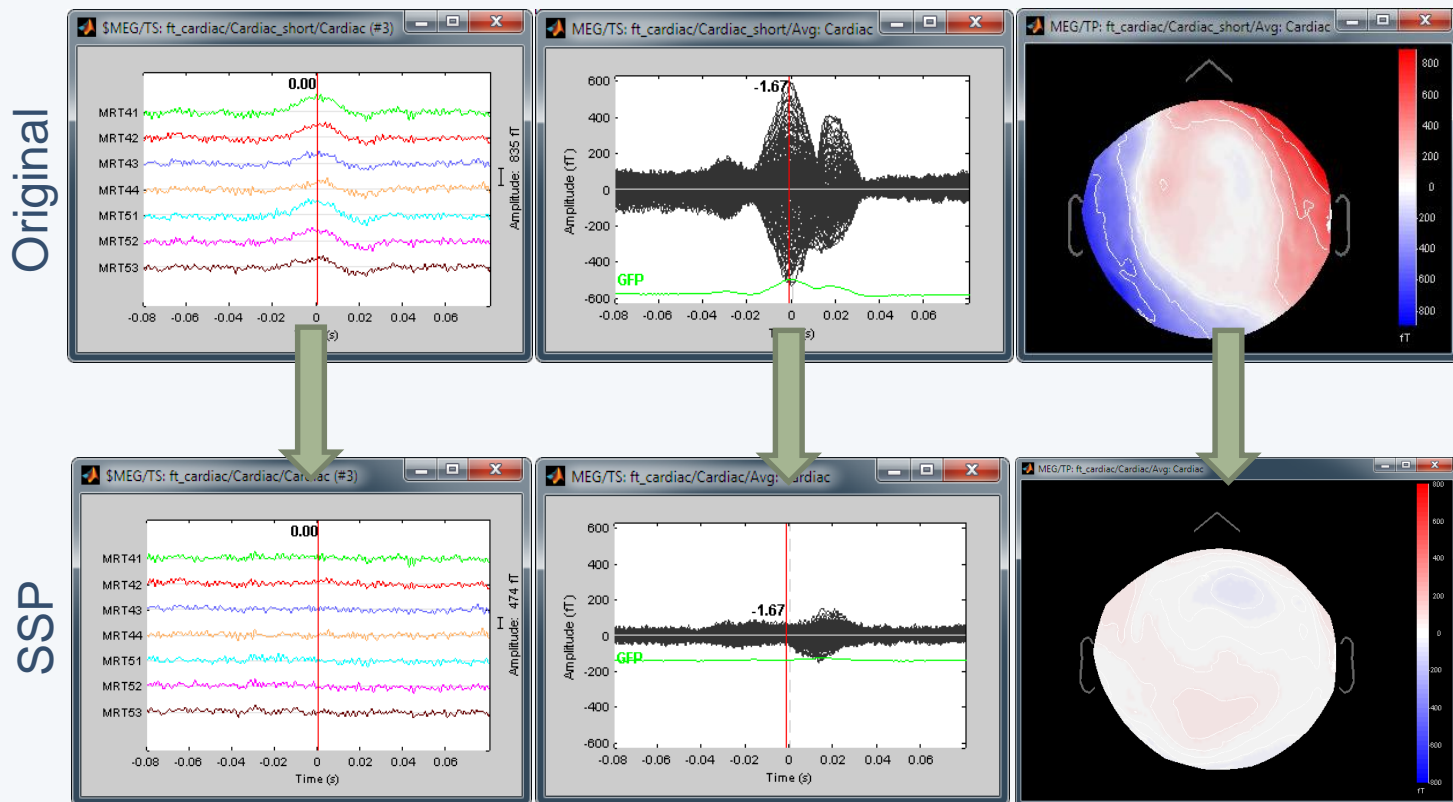
# Pre-processing

Anatomy  
Link recordings  
MRI registration

PSD  
Filters  
Bad channels  
Artifacts  
**Correction**  
Bad segments

Markers  
Epoching  
Averaging  
Sources  
Time-frequency

- Example: Cardiac artifact



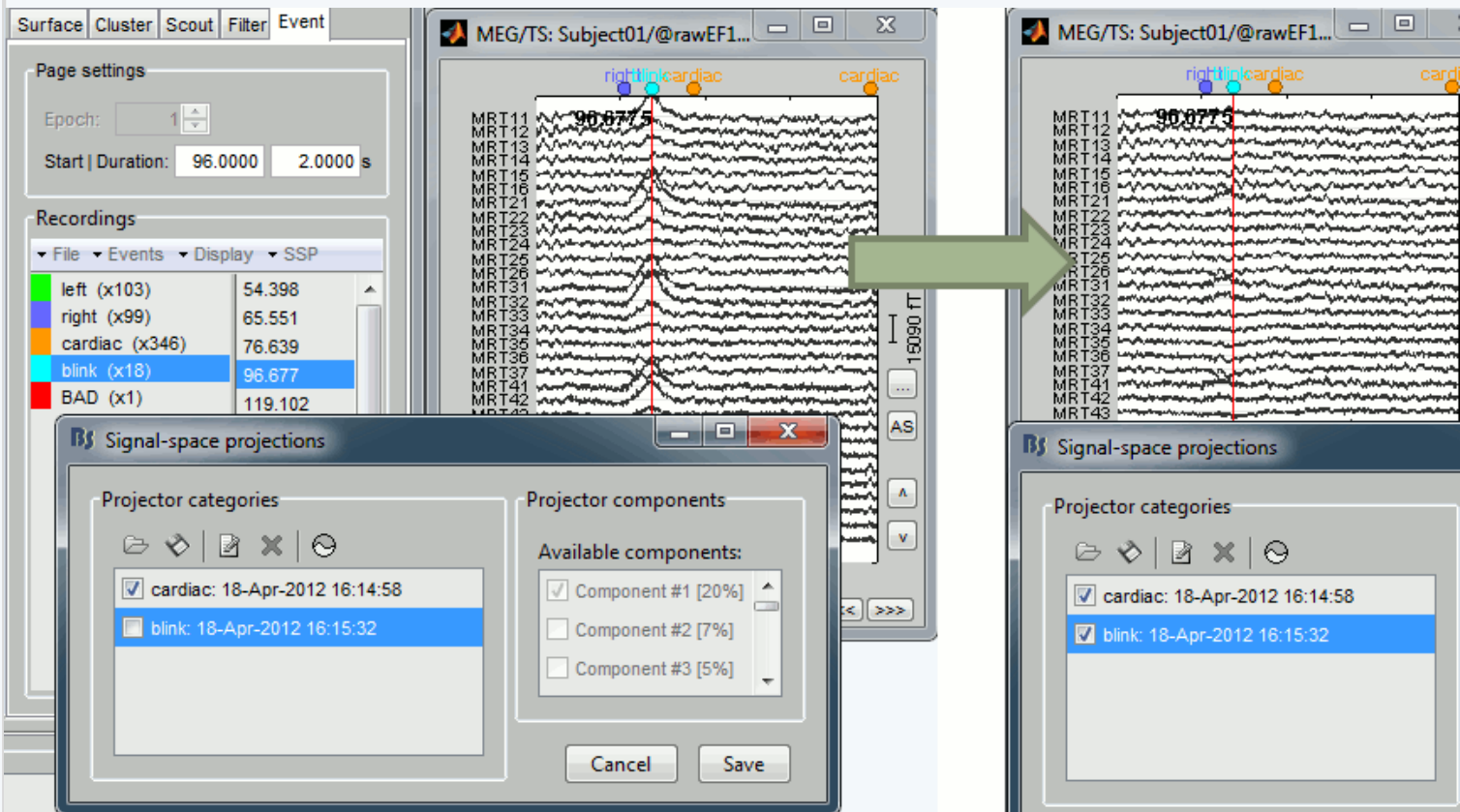
# Pre-processing

Anatomy  
Link recordings  
MRI registration

PSD  
Filters  
Bad channels  
Artifacts  
**Correction**  
Bad segments

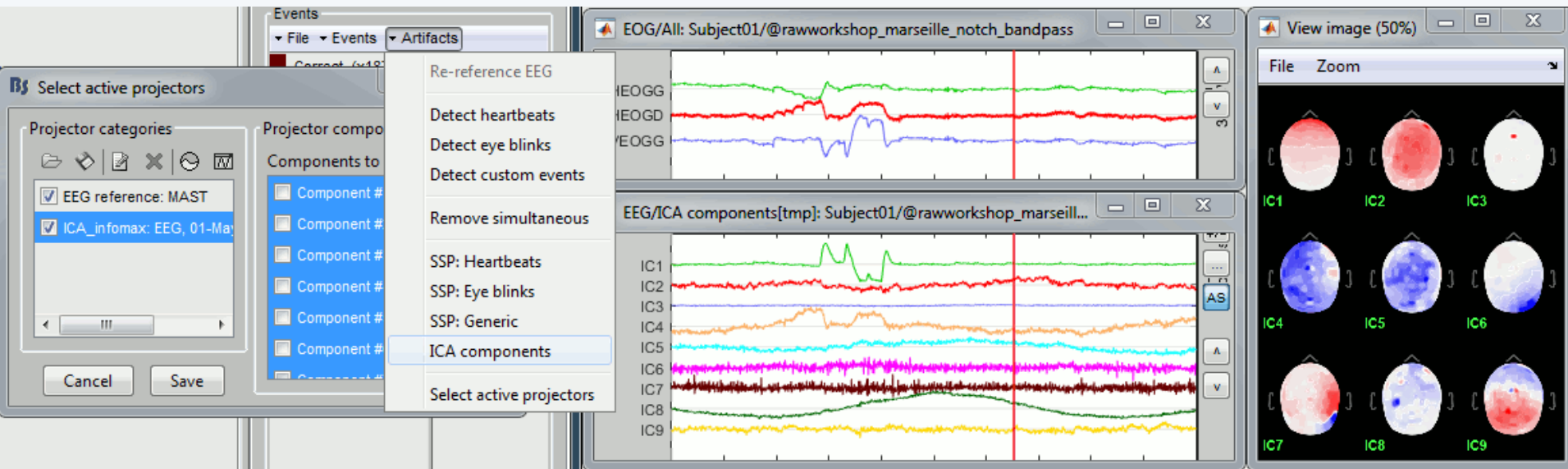
Markers  
Epoching  
Averaging  
Sources  
Time-frequency

- Example: Blink



# Pre-processing

- Independent component analysis (ICA):
  - Popular in the EEG literature
  - Alternative to SSP for low number of sensors
  - Already implemented: Infomax and JADE (EEGLAB)



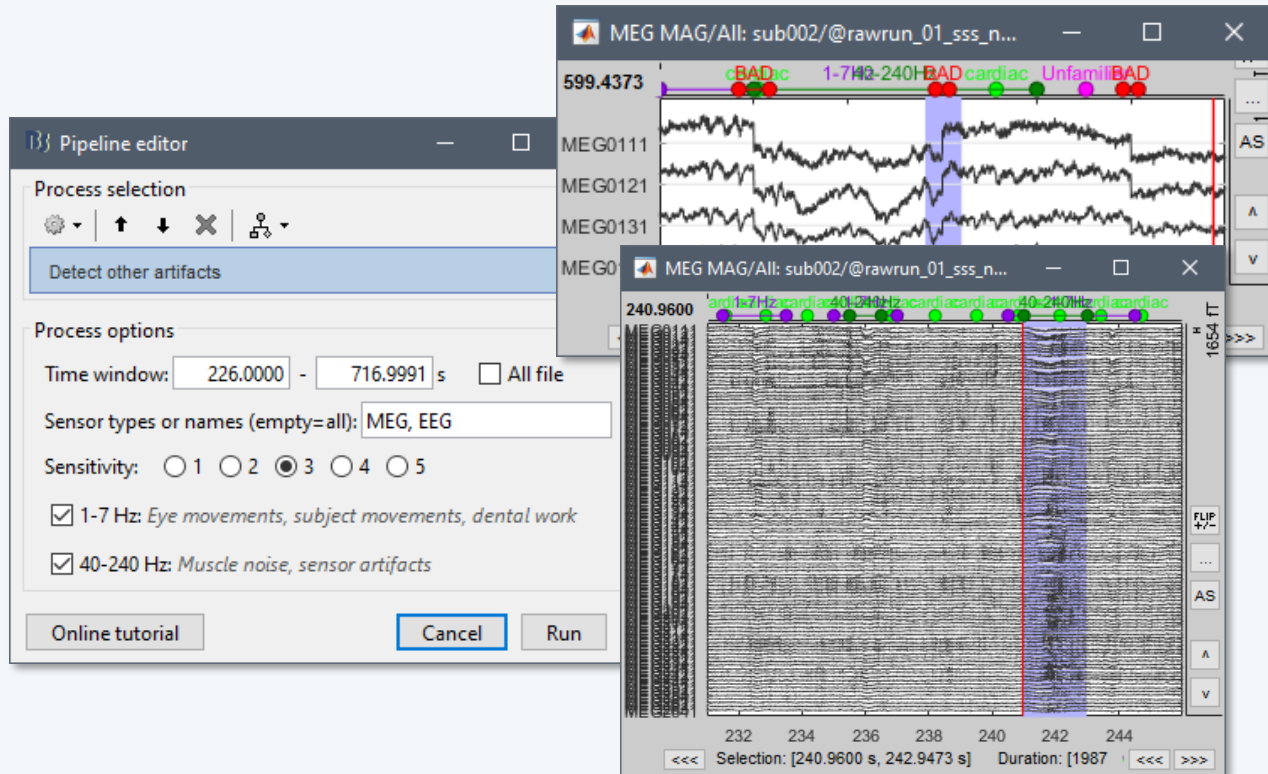
# Pre-processing

Anatomy  
Link recordings  
MRI registration

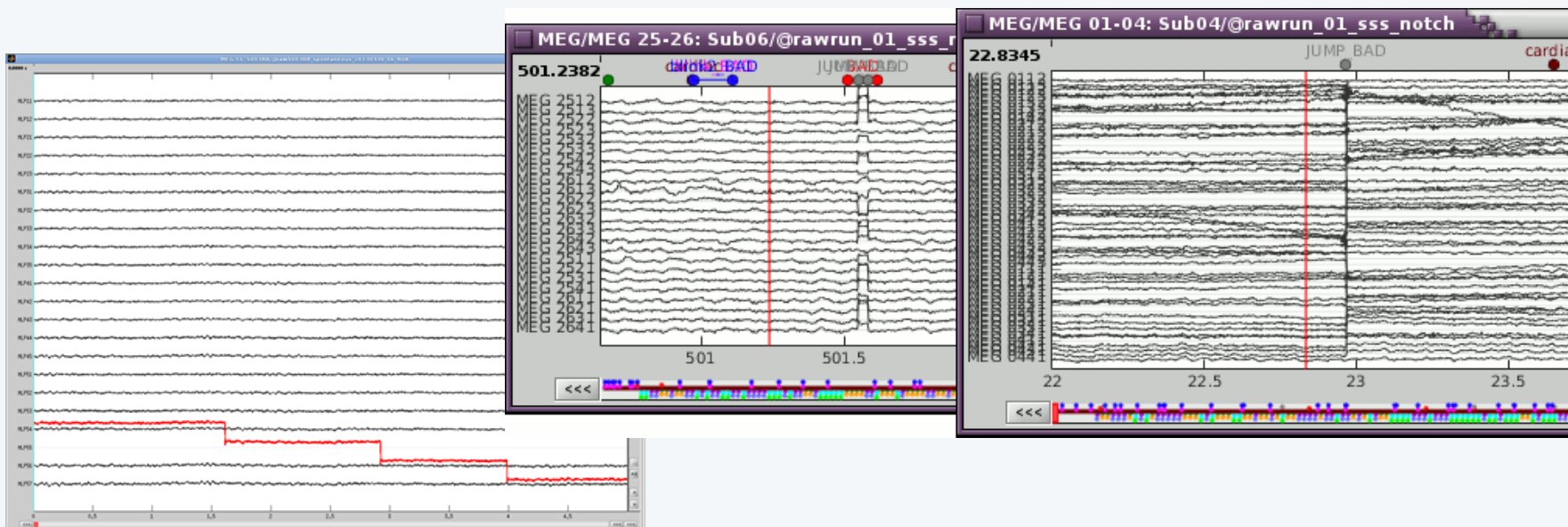
PSD  
Filters  
Bad channels  
Artifacts  
Correction  
**Bad segments**

Markers  
Epoching  
Averaging  
Sources  
Time-frequency

- Automatic detection of artifacts (RMS-based)
- Manual screening of all the recordings is advised (scroll all the sensors by pages of 10-20s)
- Exclude: Blinks, movements, SQUID jumps



- Sharps steps followed by a change of baseline value
- Mark the channels as bad before running MaxFilter
- Or mark the segments as bad in Brainstorm



# Epoching

Anatomy  
Link recordings  
MRI registration

PSD

Filters

Bad channels

Artifacts

Correction

Bad segments

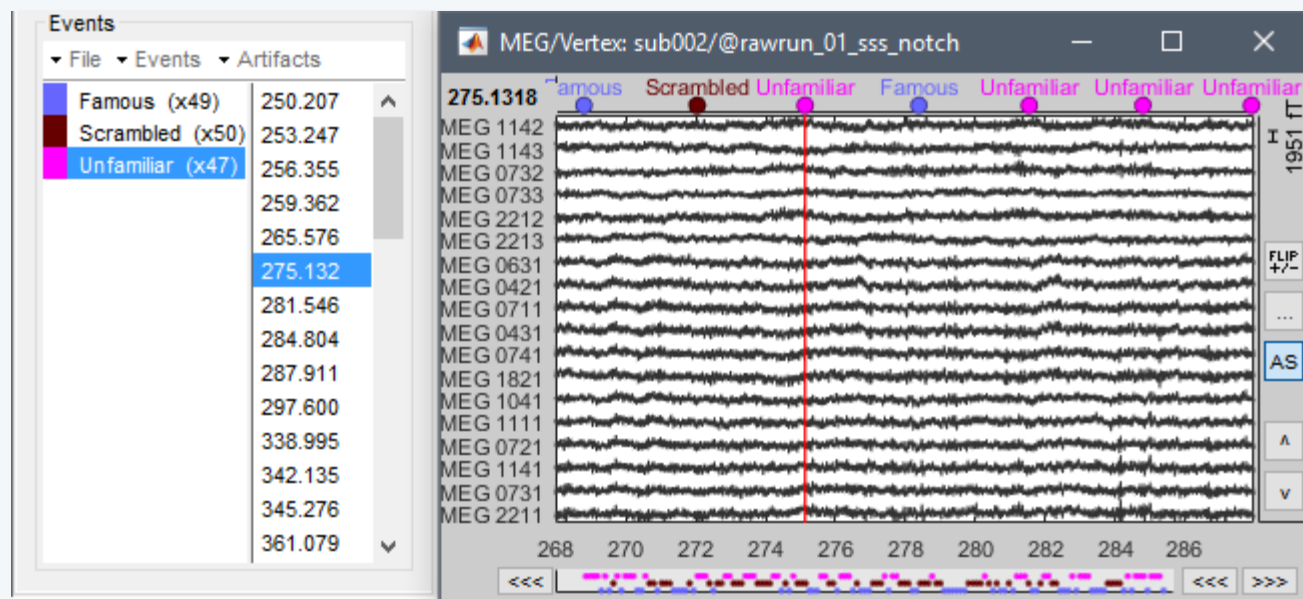
## Markers

Presentation

Sensor

Manual

- Two types of experiments:
  - Steady-state or resting-state (ongoing activity)
  - Event-based (stimulus, response, spike...)
- How to get event markers in the recordings?



# Epoching

Anatomy  
Link recordings  
MRI registration

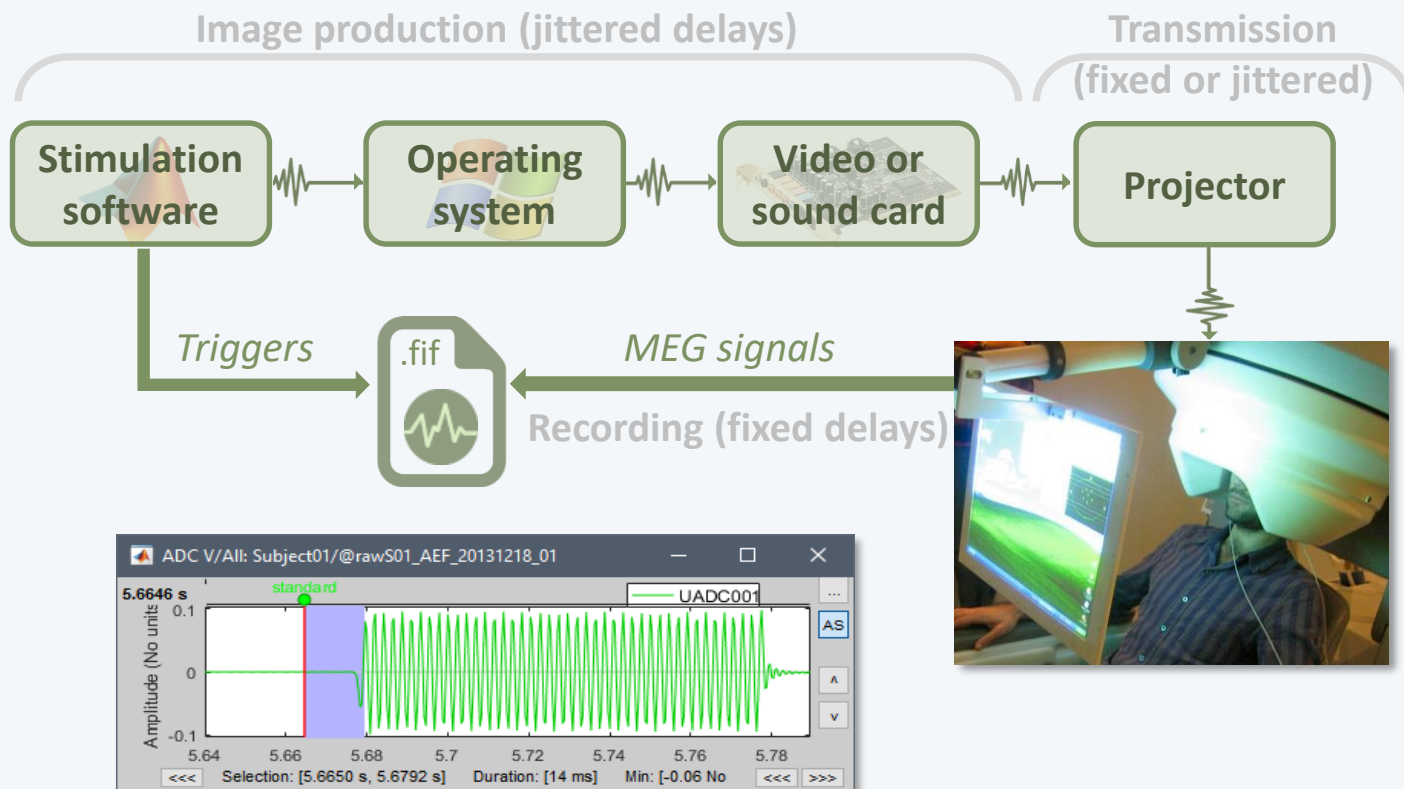
PSD  
Filters  
Bad channels  
Artifacts  
Correction  
Bad segments

Markers

## Presentation

Sensor  
Manual

- Reading the triggers saved by the presentation software (includes jittered OS delays)



- File triggers are never aligned with the real stim

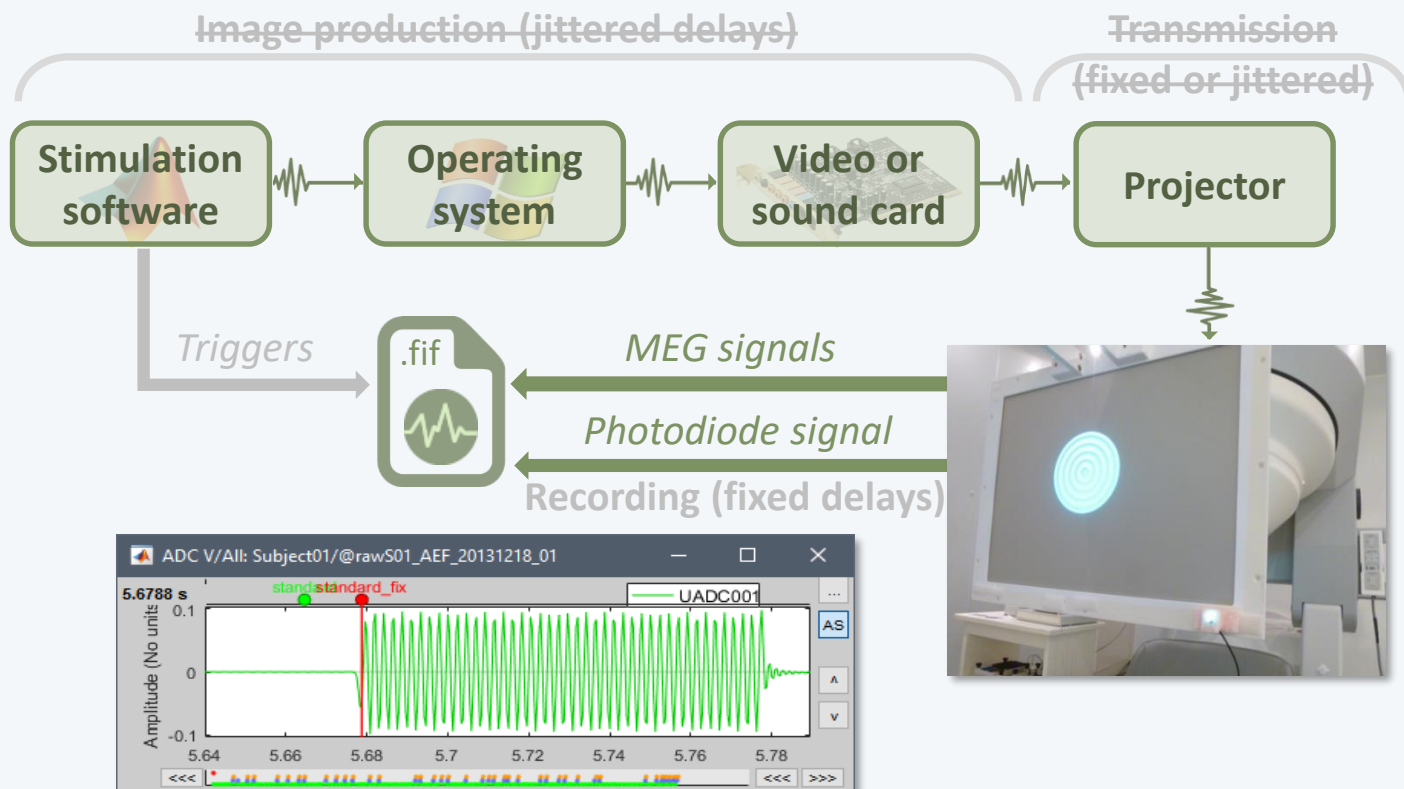
# Epoching

Anatomy  
Link recordings  
MRI registration

PSD  
Filters  
Bad channels  
Artifacts  
Correction  
Bad segments

Markers  
Presentation  
**Sensor**  
Manual

- Reading information recorded on the subject side (photodiode, microphone, response box...)



- Avoids most uncontrollable jittered delays

# Epoching

Anatomy  
Link recordings  
MRI registration

PSD

Filters

Bad channels

Artifacts

Correction

Bad segments

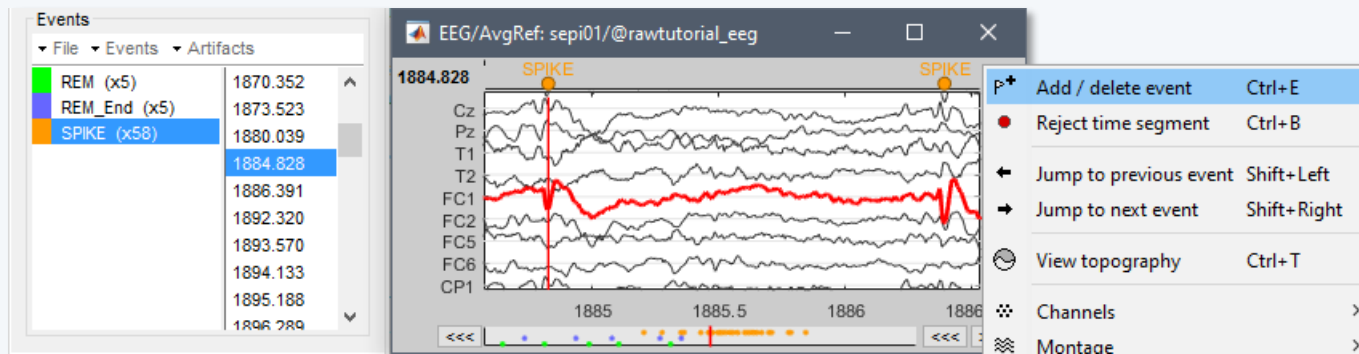
Markers

Presentation

Sensor

**Manual**

- Manual or automatic marking of biological or behavioral events, post-acquisition (epileptic spikes, sleep spindles, rat position in a box...)
- Optimized workflow for clinicians (keyboard and mouse shortcuts, workspace...)



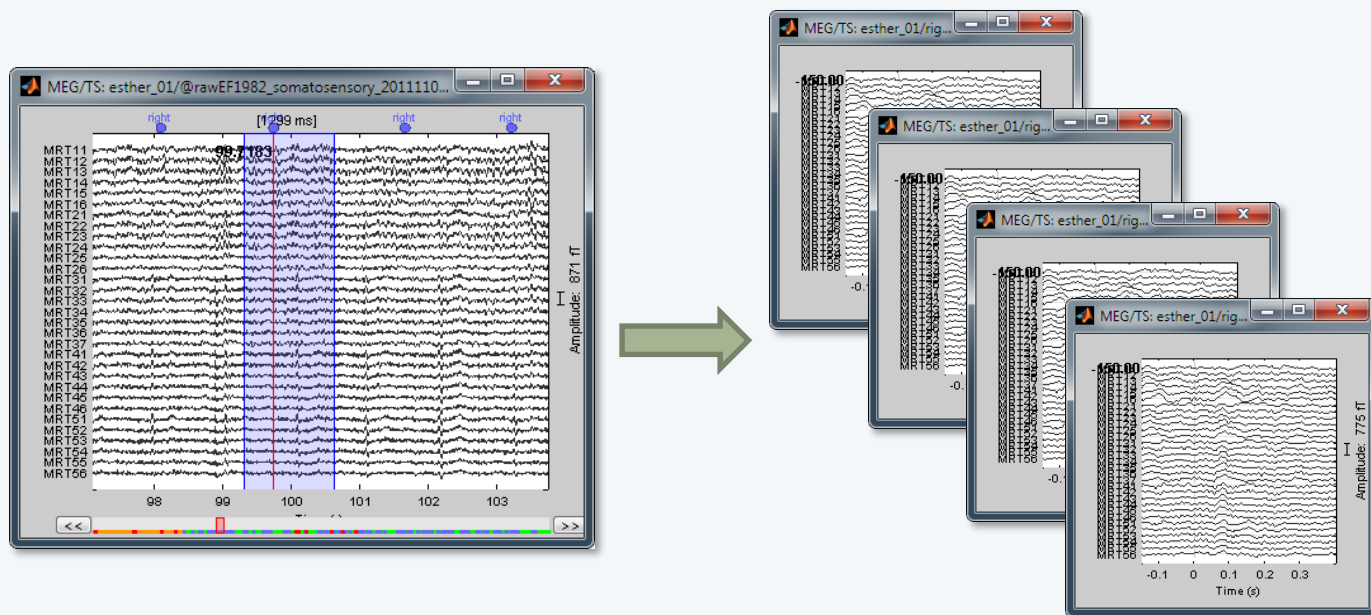
# Epoching

Anatomy  
Link recordings  
MRI registration

PSD  
Filters  
Bad channels  
Artifacts  
Correction  
Bad segments

Markers  
Epoching  
Combine  
**Extract**  
Length  
Process

- Epochs = Trials = Short blocks of recordings around an event of interest.
- Epoching = Extracting epochs from the continuous recordings and saving them.



# Epoching

Anatomy  
Link recordings  
MRI registration

PSD

Filters

Bad channels

Artifacts

Correction

Bad segments

Markers

Epoching

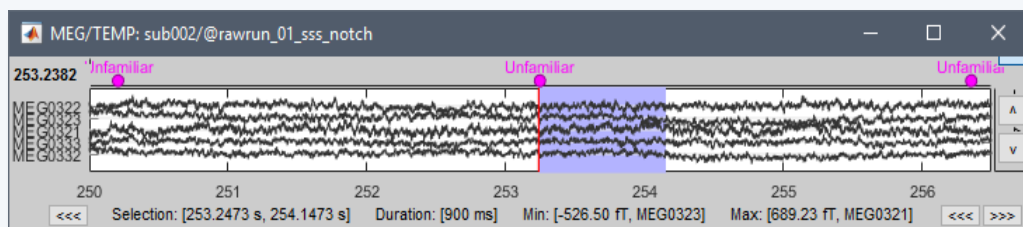
Combine

Extract

**Length**

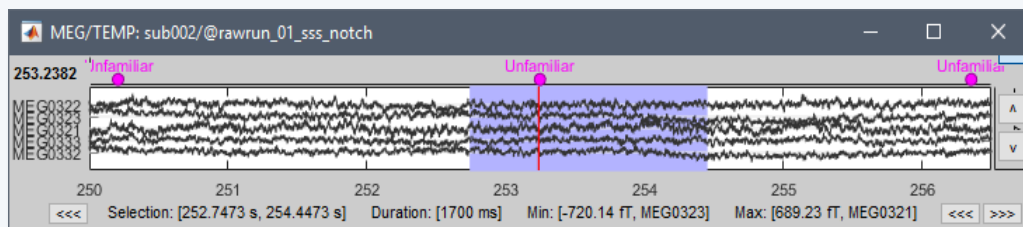
Process

- How to define the optimal epoch length ?
- Experimental design:  
Expected effect duration, inter-stimulus interval



[0,900] ms

- Analysis: Frequency filters and amplitude normalizations may require longer epochs



+ 200ms baseline  
+ 300ms filters  
= [-500, 1200] ms

- Computational limitations: Size and time

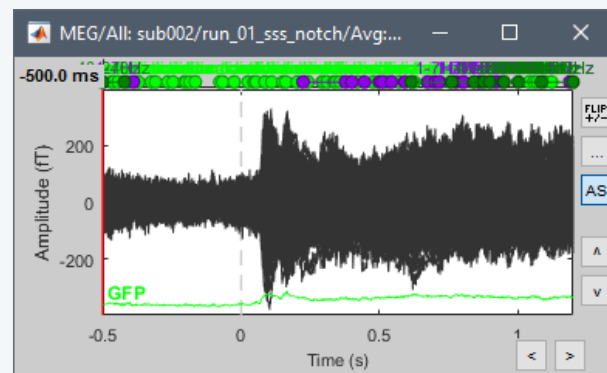
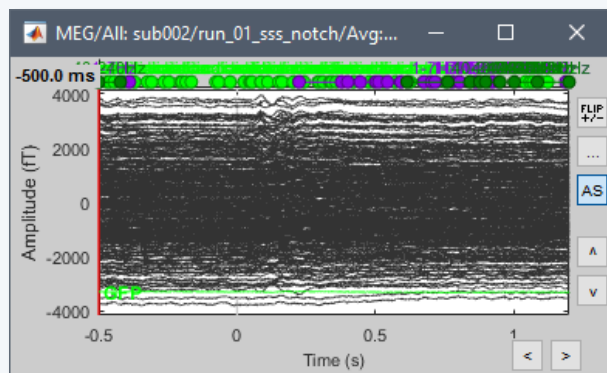
# Epoching

Anatomy  
Link recordings  
MRI registration

PSD  
Filters  
Bad channels  
Artifacts  
Correction  
Bad segments

Markers  
Epoching  
Combine  
Extract  
Length  
**Process**

- Processing steps that can be applied on epochs:
  - **DC offset correction:** Subtract the average estimated over a baseline period
  - **Detrending:** Subtract a linear trend estimated over a reference period
  - **Resampling:** Decrease the sampling rate
- This dataset: DC correction, baseline= $[-500,0]$ ms



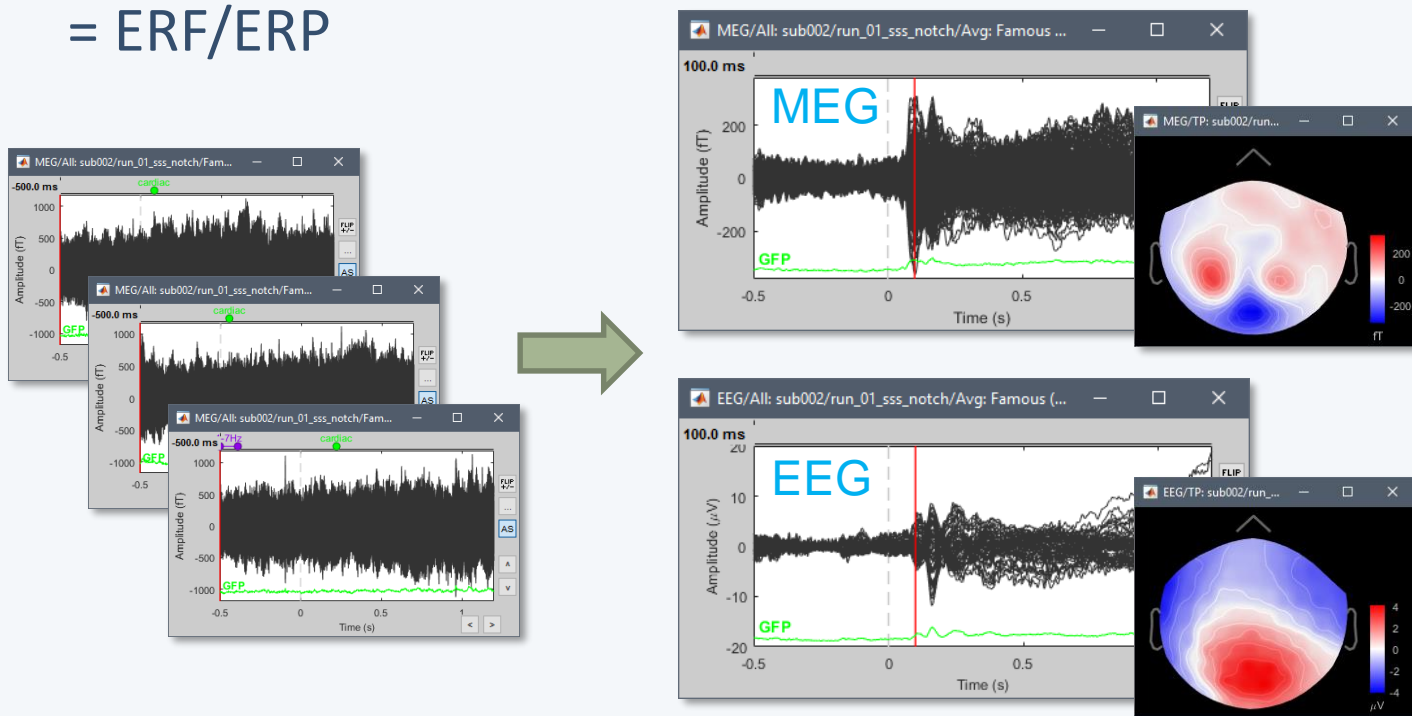
# Single subject

Anatomy  
Link recordings  
MRI registration

PSD  
Filters  
Bad channels  
Artifacts  
Correction  
Bad segments

Markers  
Epoching  
**Averaging**  
Sources  
Time-frequency

- Averaging the trials: Reveals the features of the signals that are locked in time to a given event
  - = Event-related field / potential
  - = Evoked response
  - = ERF/ERP



# Single subject

Anatomy  
Link recordings  
MRI registration

PSD  
Filters  
Bad channels  
Artifacts  
Correction  
Bad segments

Markers  
Epoching  
**Averaging**  
Sources  
Time-frequency

- **EEG:** Averaging data across runs and subjects OK.
- **MEG:** Averaging across runs is not always accurate
  - Head shapes differ between subjects.
  - Head positions different between runs.
  - One sensor does not record the same thing in two different runs.
  - Coregistration of runs with Elekta MaxFilter helps but modifies a lot the recordings.  
Never use this to average across subjects.
  - Recommended: Estimate the sources for each run separately, then average in source space.

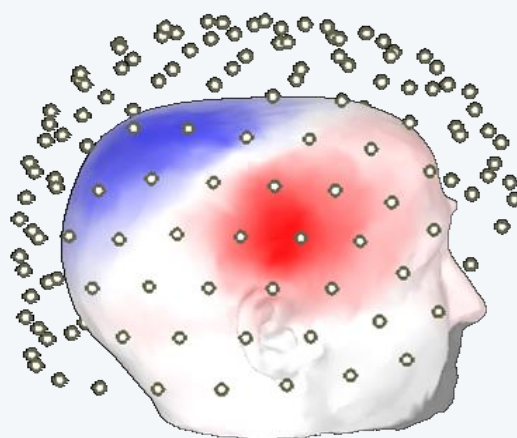
# Single subject

Anatomy  
Link recordings  
MRI registration

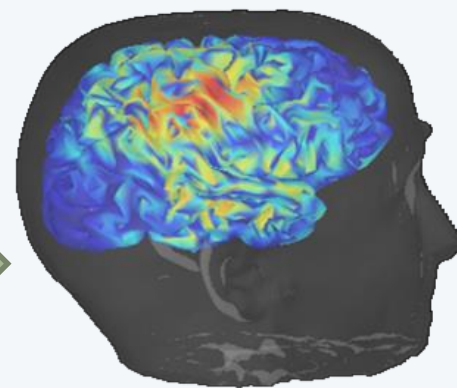
PSD  
Filters  
Bad channels  
Artifacts  
Correction  
Bad segments

Markers  
Epoching  
Averaging  
**Sources**  
Time-frequency

- Source space: Cortex or full head volume
- Forward model: Overlapping spheres (MEG)  
OpenMEEG BEM (EEG)
- Inverse model: **Minimum norm estimates**  
Beamformers  
Separately for MEG and EEG



*Sensor space*



*Source space*

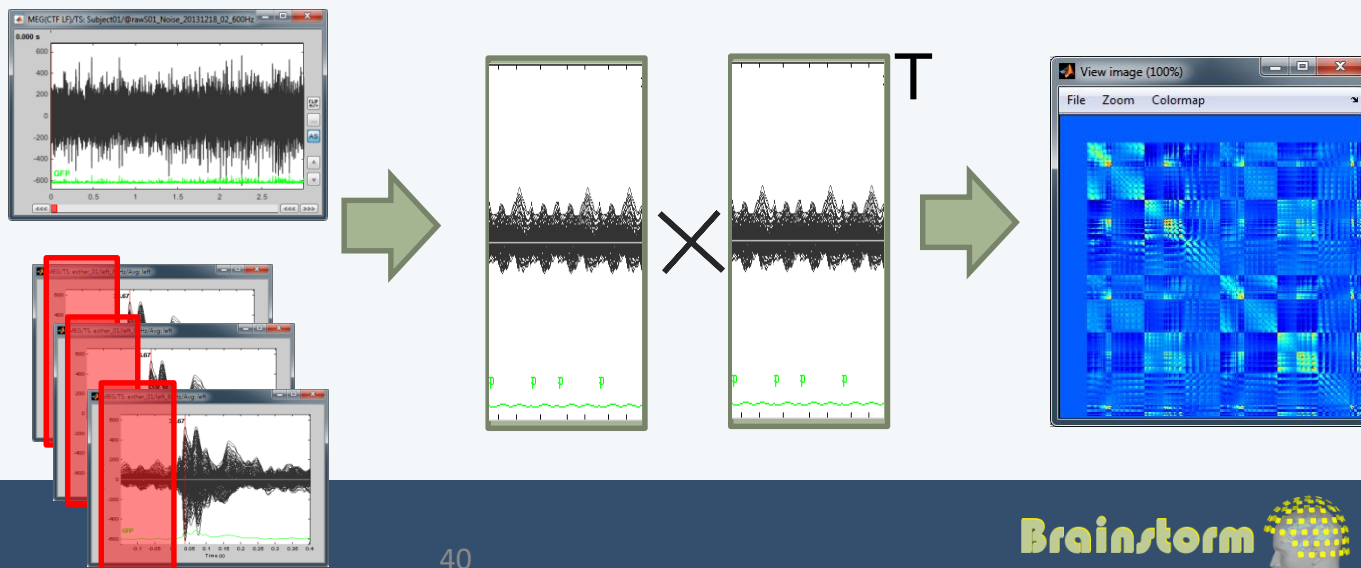
# Single subject

Anatomy  
Link recordings  
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PSD  
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Markers  
Epoching  
Averaging  
**Sources**  
Time-frequency

- The MNE model requires an estimation of the level of noise of the sensors
- Noise covariance matrix = covariance of segments that do not contain any “meaningful” data
- Empty room, pre-stim baseline, resting



# Single subject

Anatomy  
Link recordings  
MRI registration

PSD  
Filters  
Bad channels  
Bad segments

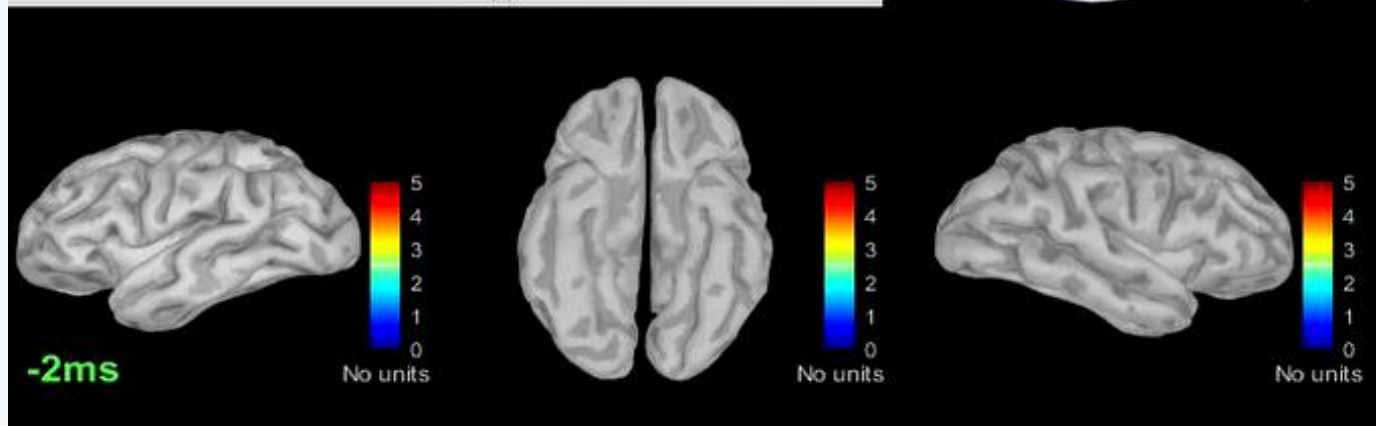
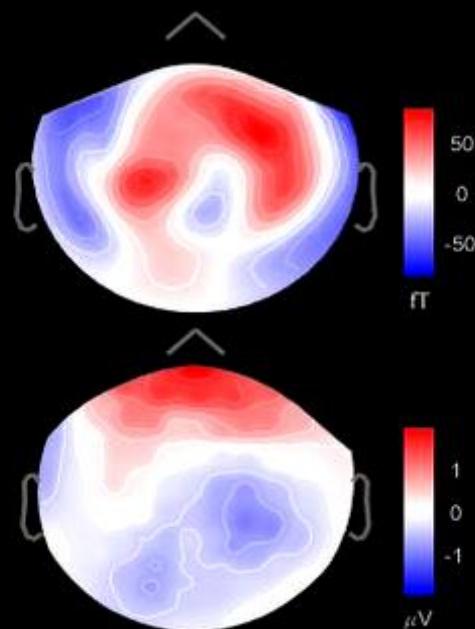
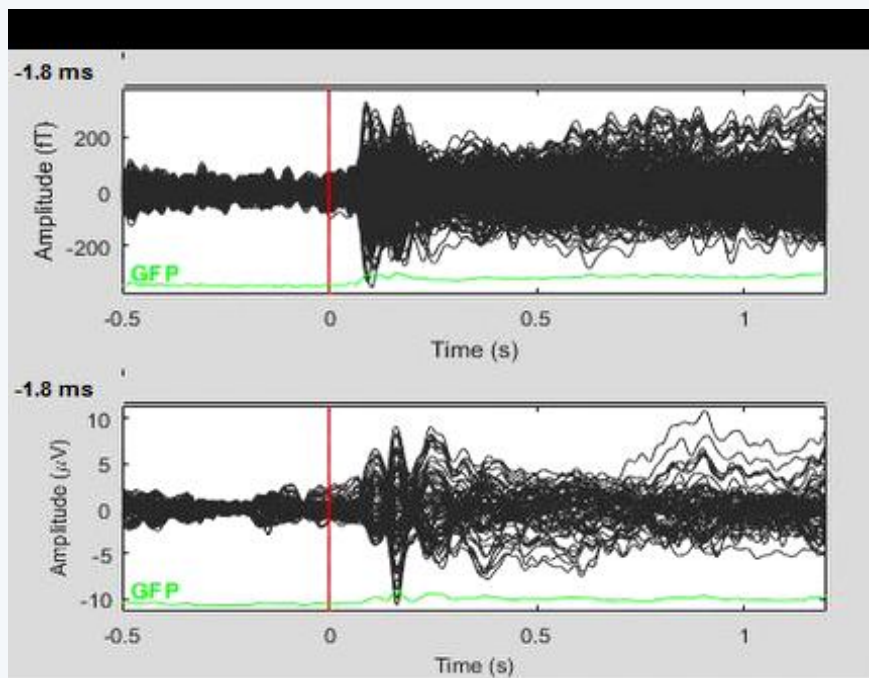
Markers  
Epoching  
Averaging  
**Sources**  
Time-frequency

MEG

EEG

MEG sources

Famous faces



# Single subject

Anatomy  
Link recordings  
MRI registration

PSD

Filters

Bad channels

Artifacts

Correction

Bad segments

Markers

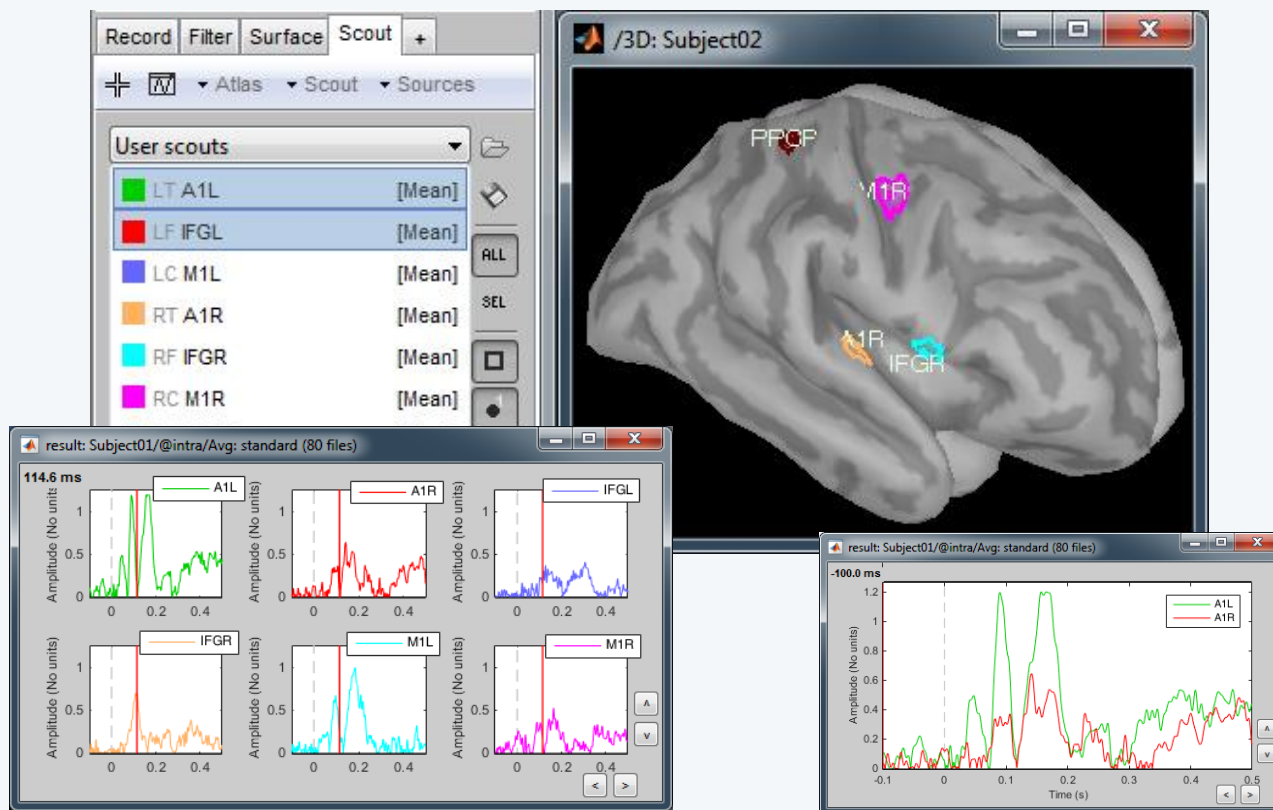
Epoching

Averaging

**Sources**

Time-frequency

- Regions of interest at cortical level (scouts)
  - = Subset of a few dipoles in the brain
  - = Group of vertices of the cortex surface



# Single subject

Anatomy

Link recordings

MRI registration

PSD

Filters

Bad channels

Artifacts

Correction

Bad segments

Markers

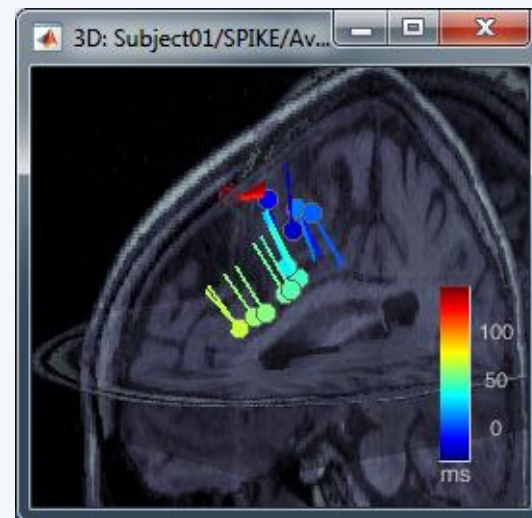
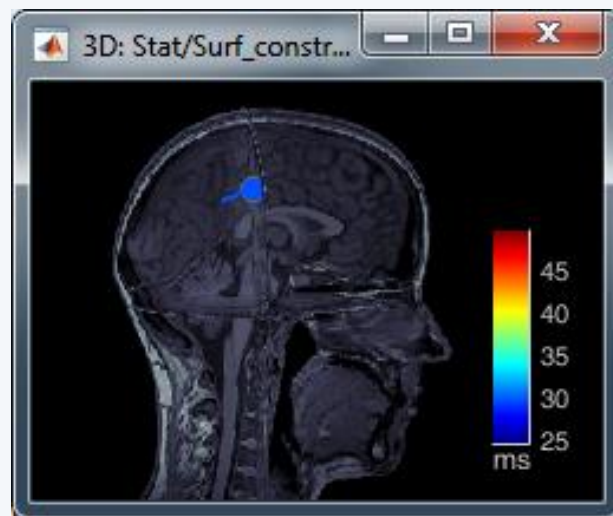
Epoching

Averaging

**Sources**

Time-frequency

- **Dipole scanning**  
Compute a distributed source model, then find the most significant dipole at each time sample.
- **Dipole fitting (FieldTrip)**  
Non-linear search of the dipoles that minimizes the residuals (data explained - recordings)

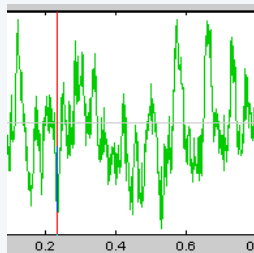


# Single subject

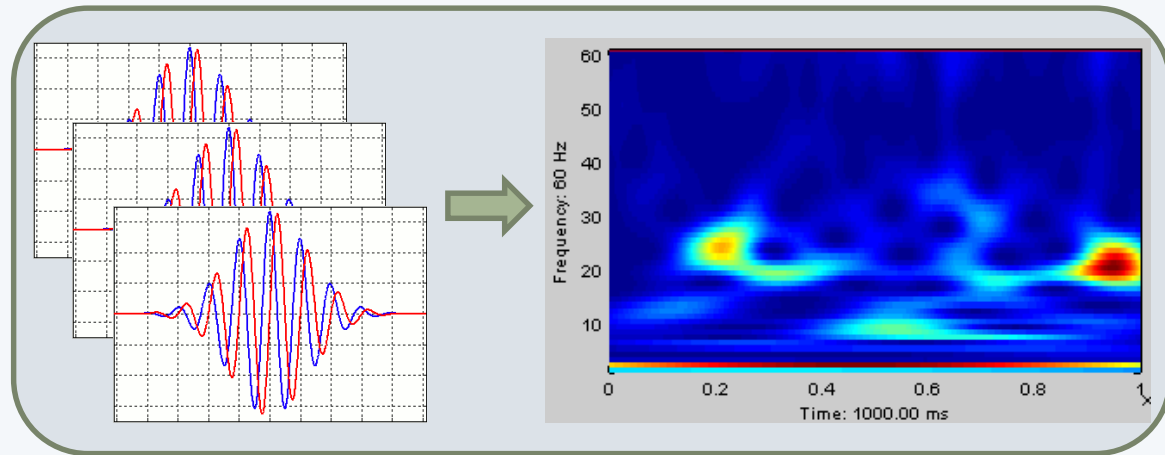
Anatomy  
Link recordings  
MRI registration

PSD  
Filters  
Bad channels  
Artifacts  
Correction  
Bad segments

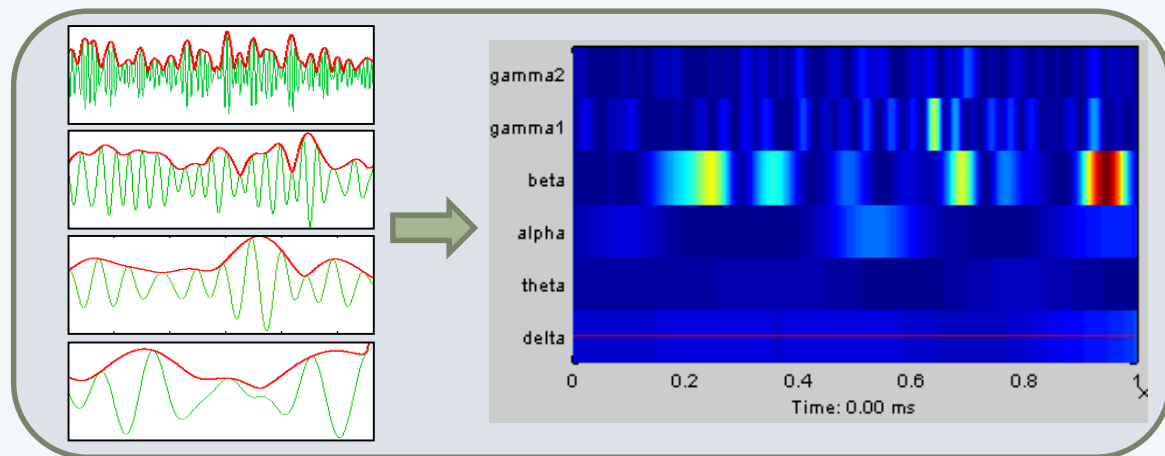
Markers  
Epoching  
Averaging  
Sources  
**Time-frequency**



## Morlet wavelets



## Hilbert transform + band-pass filter



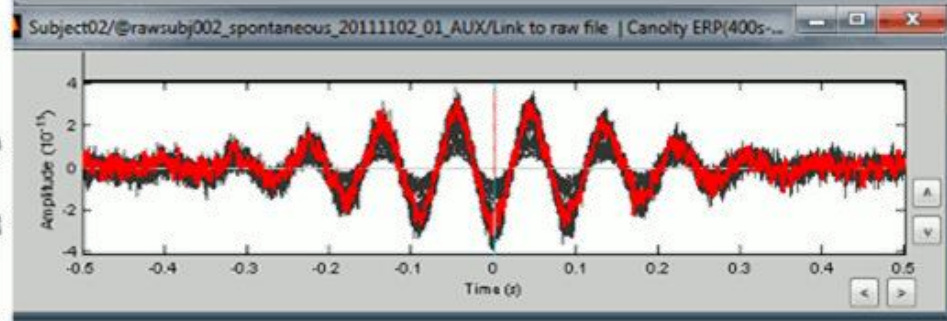
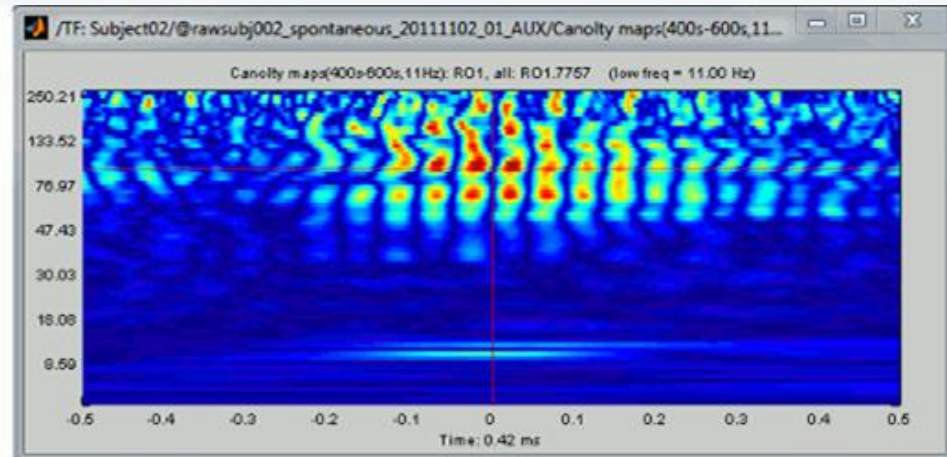
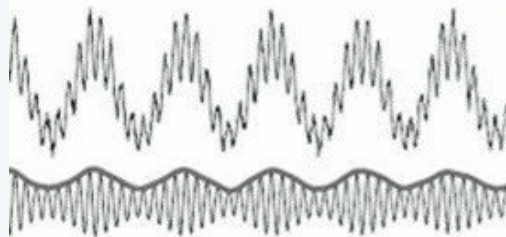
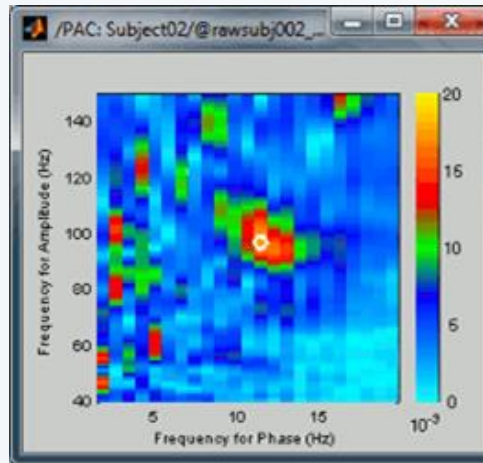
# Single subject

Anatomy  
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Bad channels  
Artifacts  
Correction  
Bad segments

Markers  
Epoching  
Averaging  
Sources  
Time-frequency  
**Other measures**

- Phase-amplitude coupling



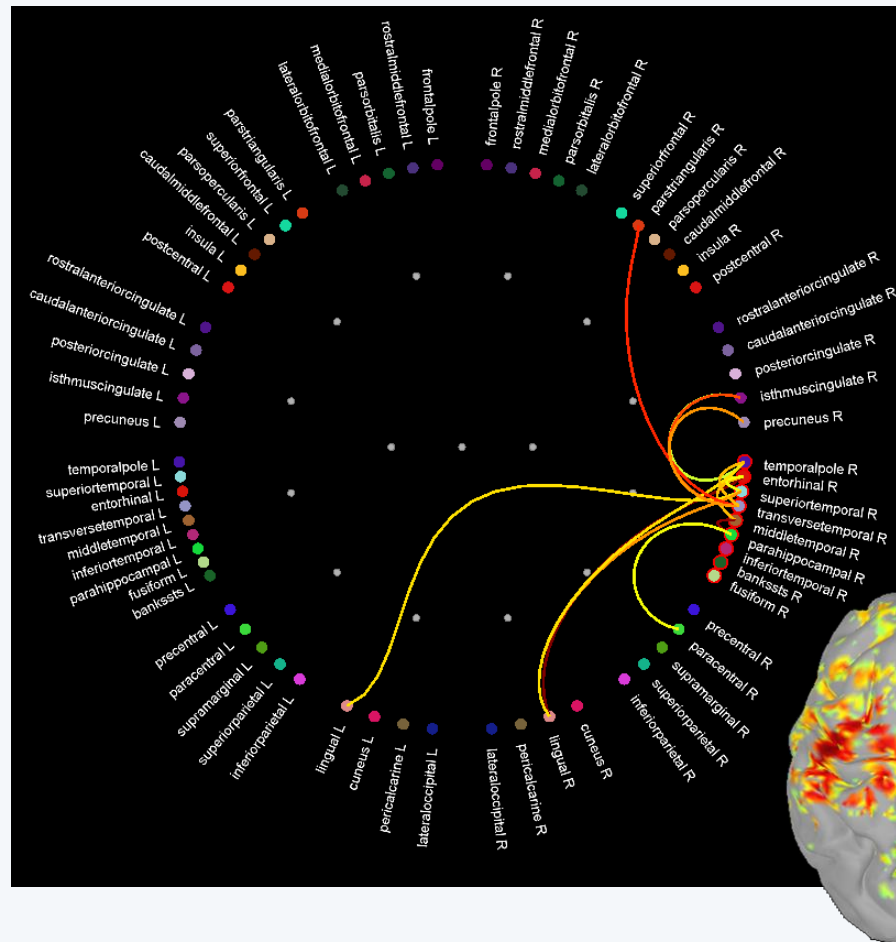
# Single subject

Anatomy  
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MRI registration

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Filters  
Bad channels  
Bad segments

Markers  
Epoching  
Averaging  
Sources  
Time-frequency  
**Other measures**

- Connectivity measures



- Correlation
- Coherence
- Phase locking value
- Granger causality

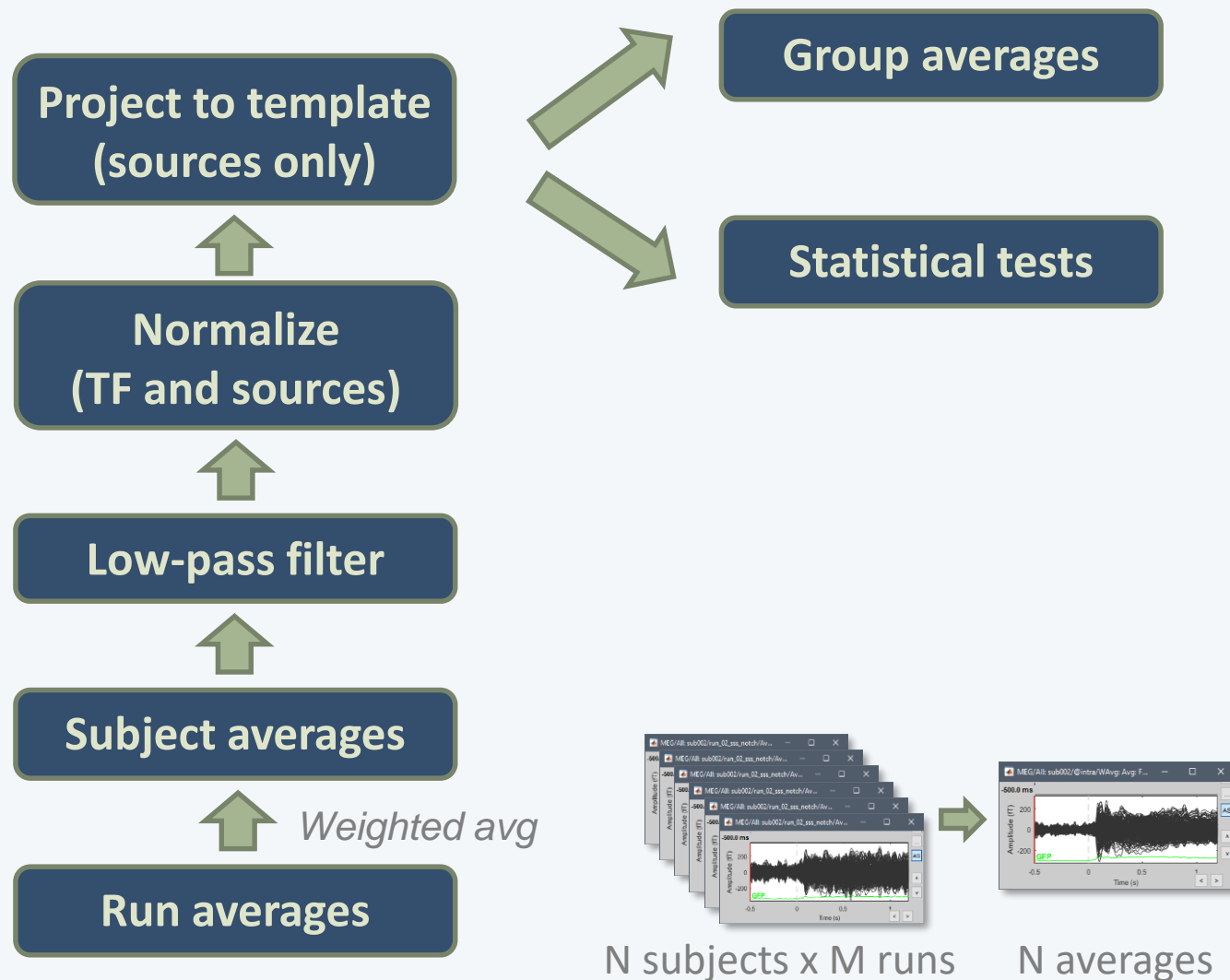


# Group analysis

Anatomy  
Link recordings  
MRI registration

PSD  
Filters  
Bad channels  
Artifacts  
Correction  
Bad segments

Markers  
Epoching  
**Averaging**  
**Sources**  
**Time-frequency**



# Group analysis

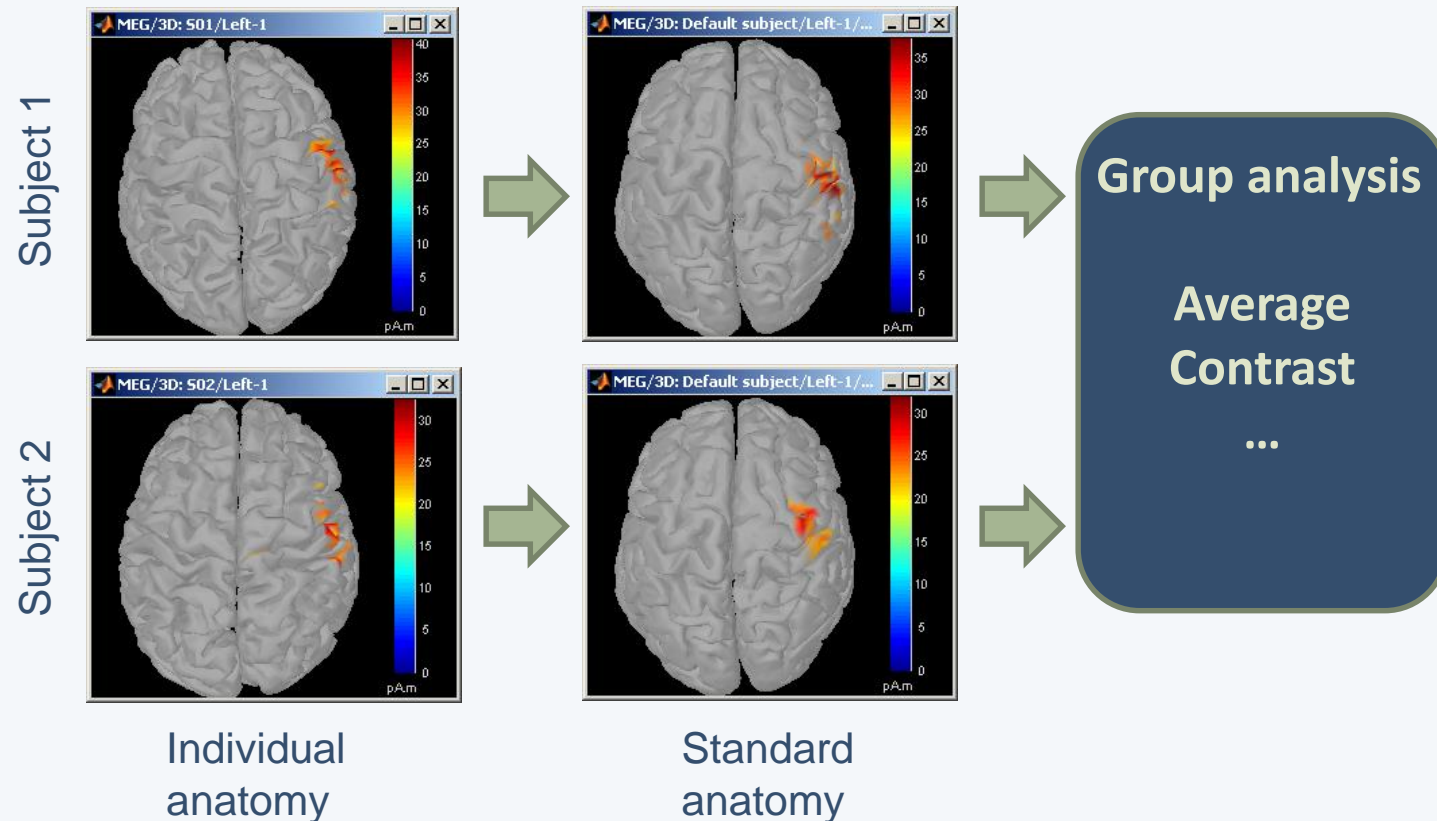
Subject averages  
Low-pass  
Normalize

## Project

Group averages  
Group statistics

Quality control  
Workflow

- Registration of individual sources on a template (ICBM152, Colin27, DNI, infants...)



# Group analysis

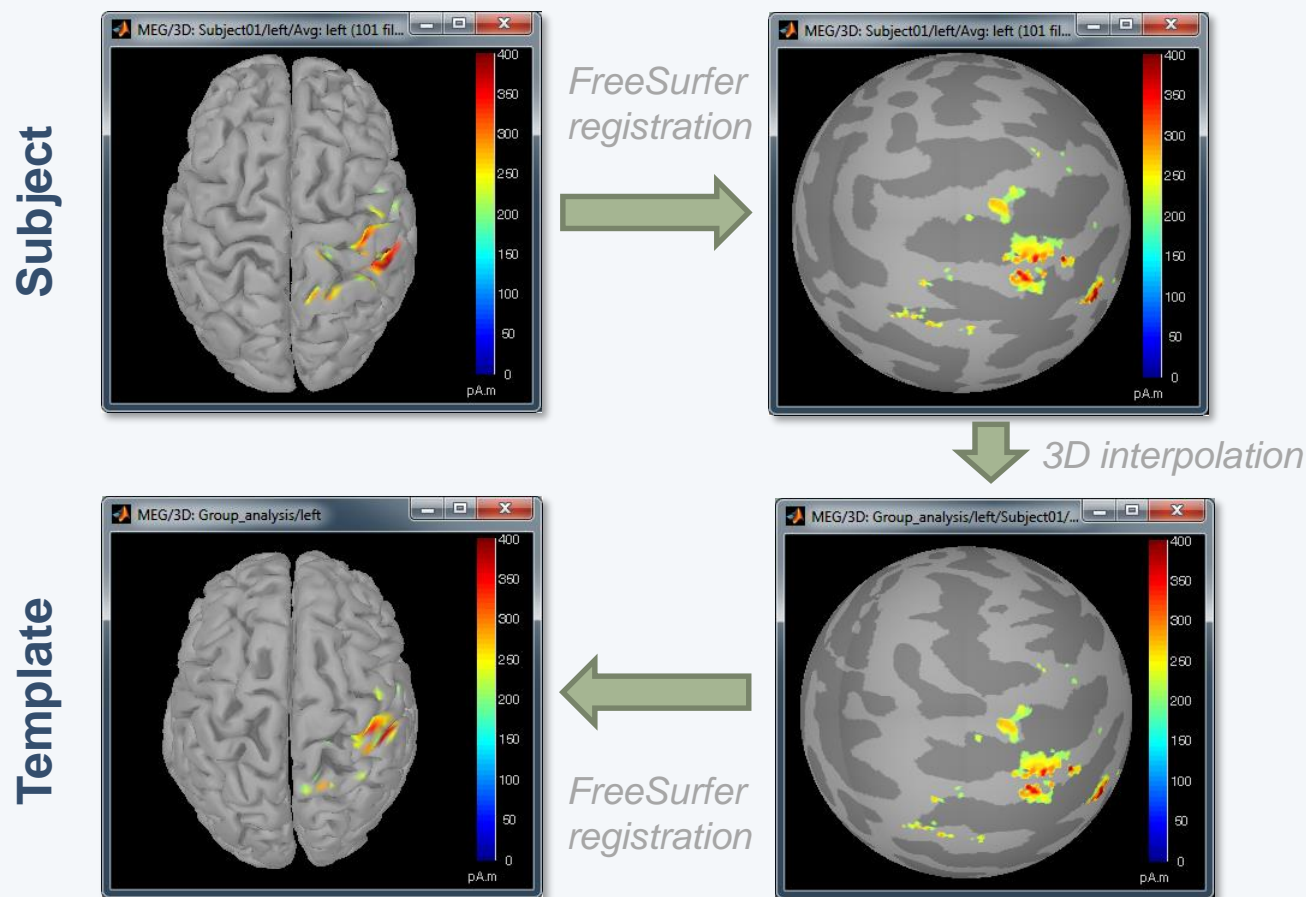
Subject averages  
Low-pass  
Normalize

## Project

Group averages  
Group statistics

Quality control  
Workflow

- Using FreeSurfer registration



# Group analysis

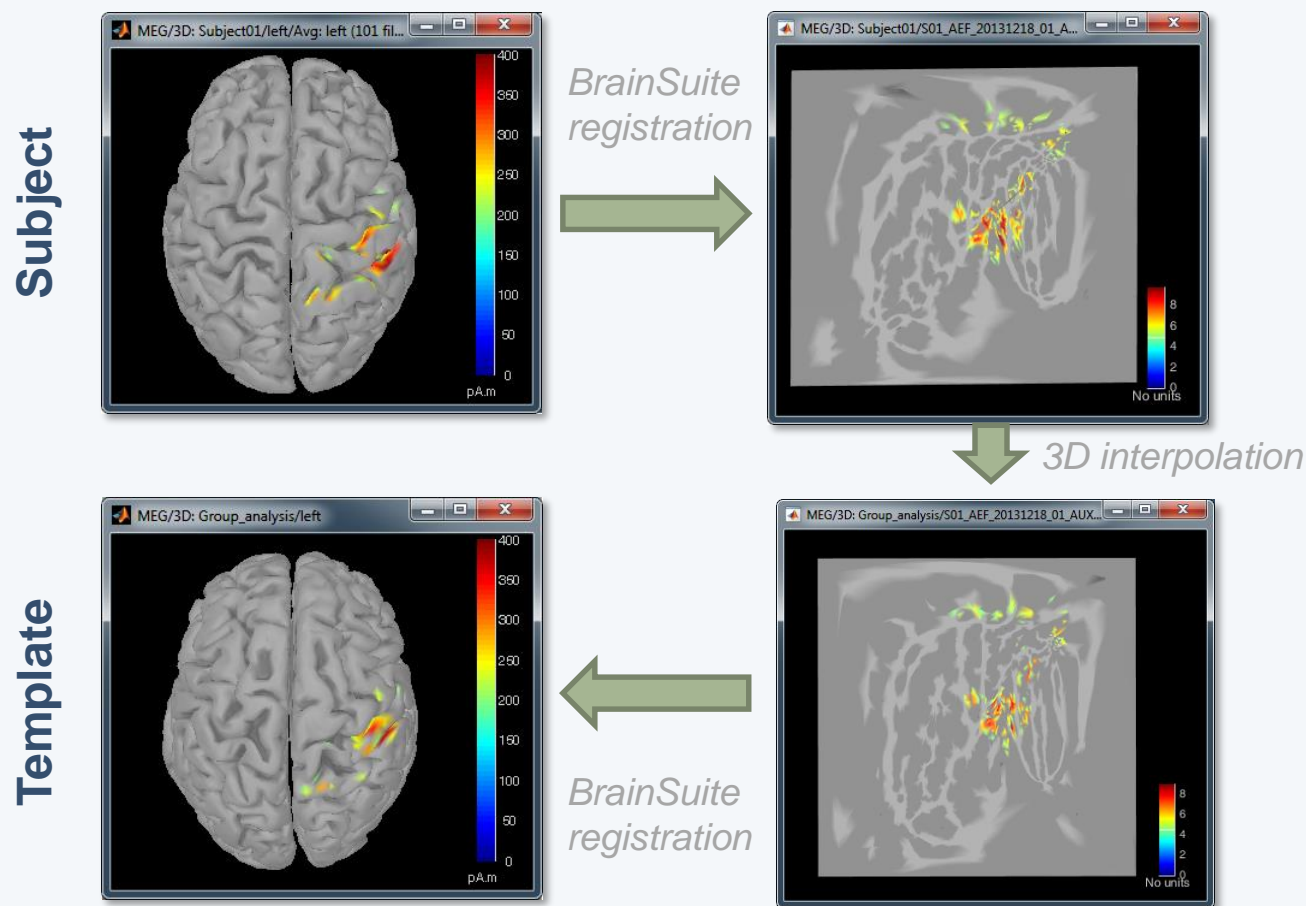
Subject averages  
Low-pass  
Normalize

## Project

Group averages  
Group statistics

Quality control  
Workflow

- Using BrainSuite registration



# Group analysis

Subject averages

Low-pass

Normalize

Project

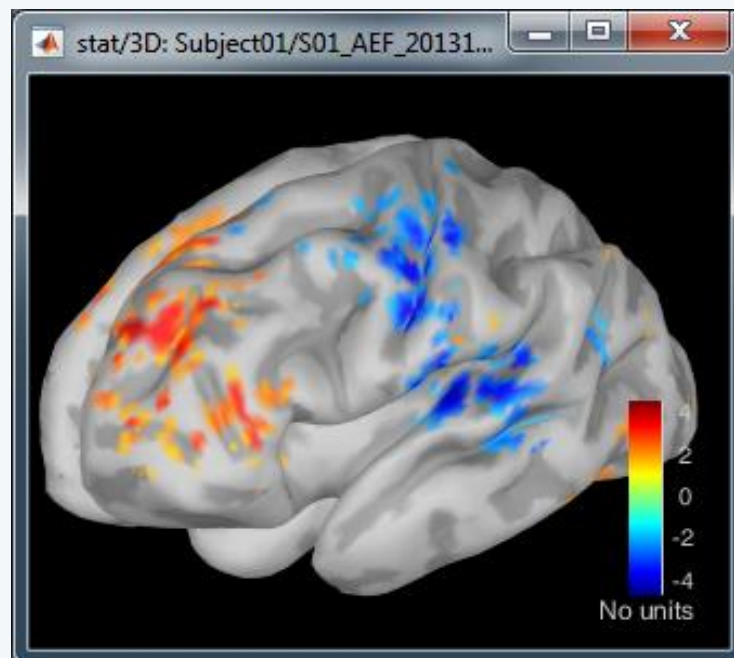
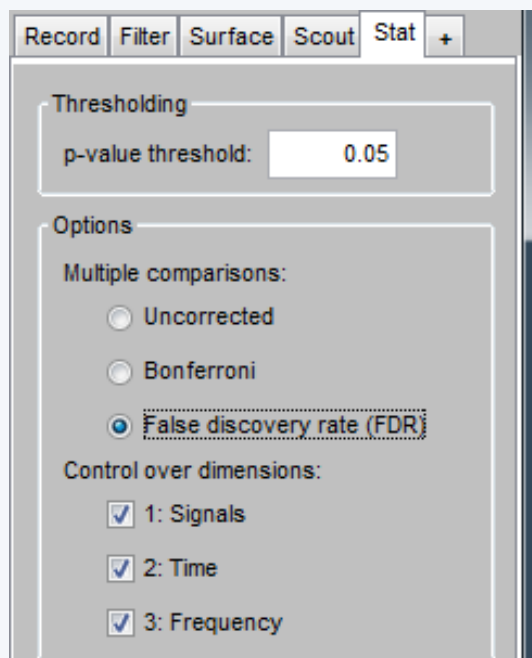
Group averages

**Group statistics**

Quality control

Workflow

- Contrasts between subjects or conditions
- Parametric t-test
- Cluster-based non-parametric tests
- Export to: **SPM**, R, Excel, SPSS, Matlab...



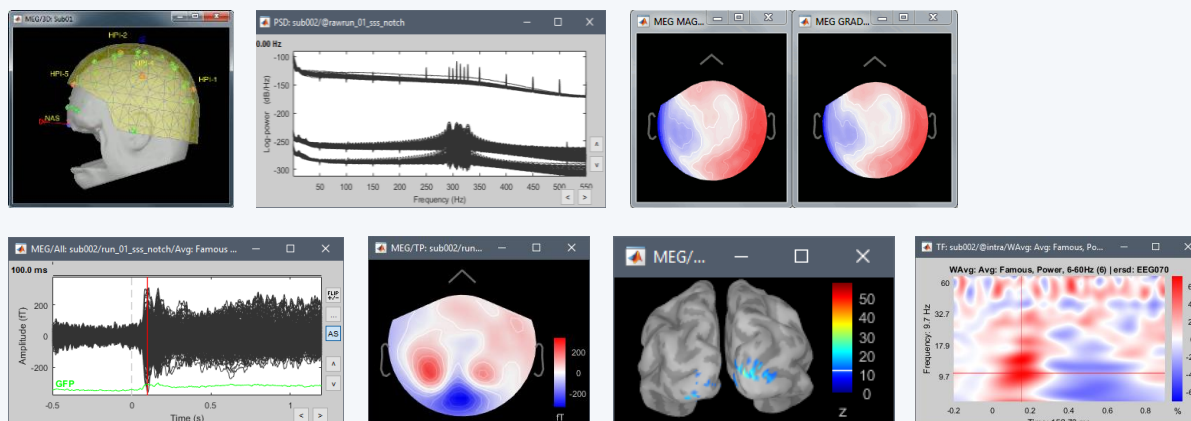
# Group analysis

Subject averages  
Low-pass  
Normalize  
Project

Group averages  
Group statistics

**Quality control**  
Workflow

- When scripting the analysis, we recommend you always check visually the following items for each run separately:
  - MRI/sensors registration
  - PSD before and after filters
  - SSP and ICA component topographies
  - ERP/ERF: Sensors time series
  - ERP/ERF: Sensors topo of primary response
  - ERP/ERF: Sources of primary response
  - Any other metric of interest



# Group analysis

Subject averages

Low-pass

Normalize

Project

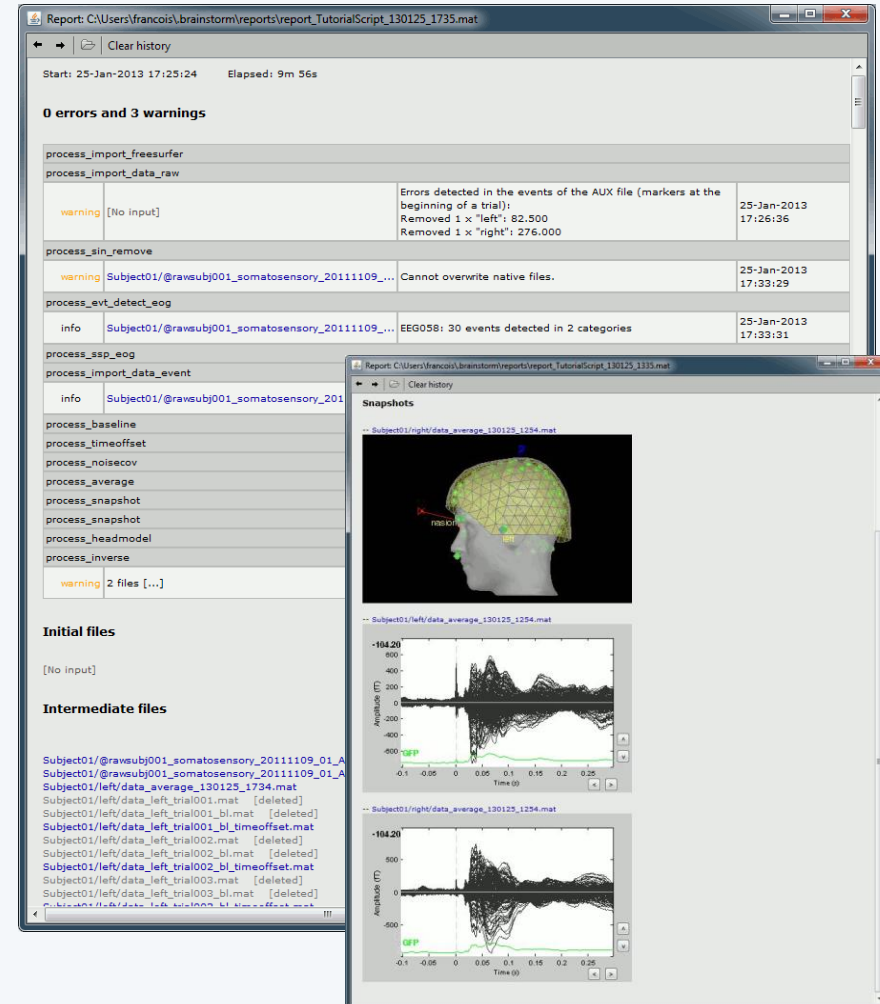
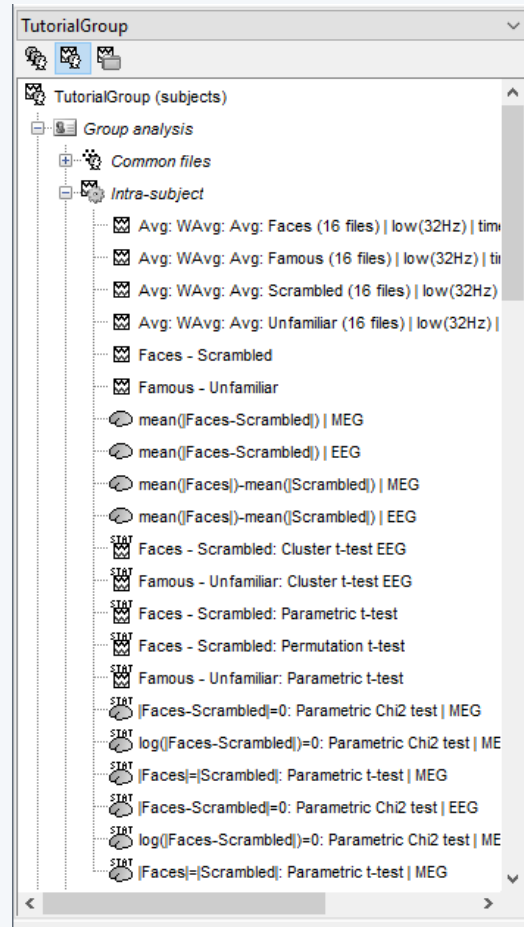
Group averages

Group statistics

Quality control

Workflow

- Execution reports with snapshots saved in HTML



# Add your code to Brainstorm

- Direct manipulation of the files in Matlab
- Use the menu “Run Matlab command”
- Write a plugin:
  - Well documented API
  - Lots of example (170 functions written as plugins)
- Examples of recent external contributions:
  - MVPA decoding (Oliva, MIT)
  - Microstate segmentation (Cacioppo, UChicago)
  - Eyetracker/EEG synchronization (Uni Freiburg)

# User community

- 15,500 users registered on the website



## Find users next to you

Location:

<a href="#">josiannebertrand</a>	UQAM, Montreal	EEG	post-doc	2013
<a href="#">timothynest</a>	Montreal, McGill	MEG, fNIRs	research	2013
<a href="#">Clara Moreau</a>	Montreal	MEG	stagiaire	2013

- Online tutorials: 30-hour self-training program
- Active user forum: 150 posts/month
- Daily updates: 750 downloads/month

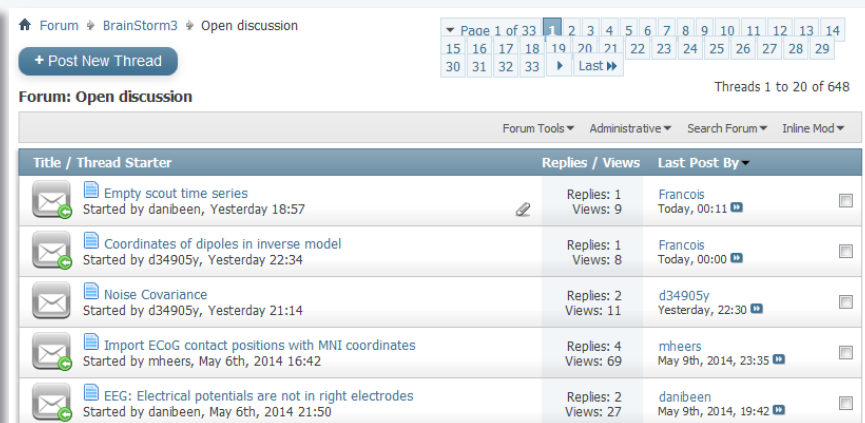


**Brainstorm** Edit Search

- Software**
  - Introduction
  - Gallery
  - Download
  - Installation
- Users**
  - Tutorials
  - Forum
  - Courses
  - Community
  - Publications
- Development**
  - What's new

### Get started

- Starting a new study**
  1. Create a new protocol [9]
  2. Import the subject anatomy [8]
  3. Explore the anatomy [13]
- Reviewing**
  4. Channel file / MRI registration [11]
  5. Continuous recordings [9]
  6. Multiple windows [5]
  7. Event markers [10]
- Pre-processing**
  8. Stimulation delays [9]
  9. Select files / Run processes [11]
  10. Power spectrum / Frequency filters [15]
  11. Bad channels [6]
  12. Artifact detection [8]
  13. Artifact cleaning with SSP [16]
  14. Additional bad segments [7]
- Epoching and averaging**
  15. Import epochs [9]
  16. Average response [7]
  17. Visual exploration [10]
  18. Colormaps [5]
  19. Clusters of sensors [4]
- Source modeling**
  20. Head model [9]
  21. Noise/data covariance
  22. Source estimation [28]
  23. Scouts [17]
- Advanced processing**
  24. Time-frequency [33]
  25. Difference [13]
  26. Statistics [30]
  27. Workflows [10]
  28. Scripting [31]



Forum BrainStorm3 Open discussion

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+ Post New Thread

Forum: Open discussion Threads 1 to 20 of 648

Forum Tools Administrative Search Forum Inline Mod

Title / Thread Starter	Replies / Views	Last Post By
Empty scout time series Started by danibeen, Yesterday 18:57	Replies: 1 Views: 9	Francois Today, 00:11
Coordinates of dipoles in inverse model Started by d34905y, Yesterday 22:34	Replies: 1 Views: 8	Francois Today, 00:00
Noise Covariance Started by d34905y, Yesterday 21:14	Replies: 2 Views: 11	d34905y Yesterday, 22:30
Import ECoG contact positions with MNI coordinates Started by mheers, May 6th, 2014 16:42	Replies: 4 Views: 69	mheers May 9th, 2014, 23:35
EEG: Electrical potentials are not in right electrodes Started by danibeen, May 6th, 2014 21:50	Replies: 2 Views: 27	danibeen May 9th, 2014, 19:42



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## Geeks



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*Inserm Grenoble*



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*MNI*

## And...

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Ghislaine Dehaene  
Antoine Ducorps  
Denis Schwartz  
...

## MEG @ McGill



Elizabeth Bock  
*MEG engineer*



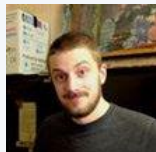
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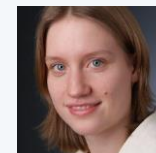
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Hossein Shahabi  
*USC*



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*Univ Hosp Cologne*



Anne-Sophie Dubarry  
*Aix-Marseille Univ*



Rey Ramirez  
*UW*

## Oddball auditory task (Dec 2013, MNI, McGill)

- Binaural stimulation with intra-aural earphones
- 200 standard beeps (400Hz) + 40 deviant (554Hz)
- Inter-stimulus interval: Random in [0.7 - 1.7] s
- Subject taps the right index when a deviant is heard
- Acquisition at 2400 Hz - Downsampled at 600Hz
- Recorded on CTF 275 MEG sensors  
+ 2 EEG (Pz,Cz) + 26 MEG reference sensors  
+ EOG + ECG + STIM + ... = 302 channels
- 6 minutes of recordings
- MRI processed with FreeSurfer 5.3