

# Preprocessing MEG Data for Analysis of Event-Related Fields (ERFs)

## Jason Taylor

MRC Cognition and Brain Sciences Unit (CBU)

Cambridge Centre for Ageing and Neuroscience (CamCAN)

Cambridge, UK

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**MAXFILTER**  
Remove Bad  
Channels, Noise /  
Transform Head Pos

**DOWNSAMPLE**  
(/Filter)

**IDENTIFY,  
COMPENSATE  
ARTEFACTS**

**FILTER**

**EPOCH**

**CONCATENATE  
SESSIONS**

**REJECT**

**AVERAGE,  
CONTRAST**

INDIVIDUAL  
SUBJECT

**GRAND AVG,  
CONTRAST**

**DISPLAY**  
GFP / Butterfly / ERF /  
ERFimage / Topography /  
3D Volume

**STATISTICS**  
(Talk later in session)

GROUP  
(or individual)

**MAXFILTER**  
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**STATISTICS**  
(Talk later in session)

## [ MaxFilter ]

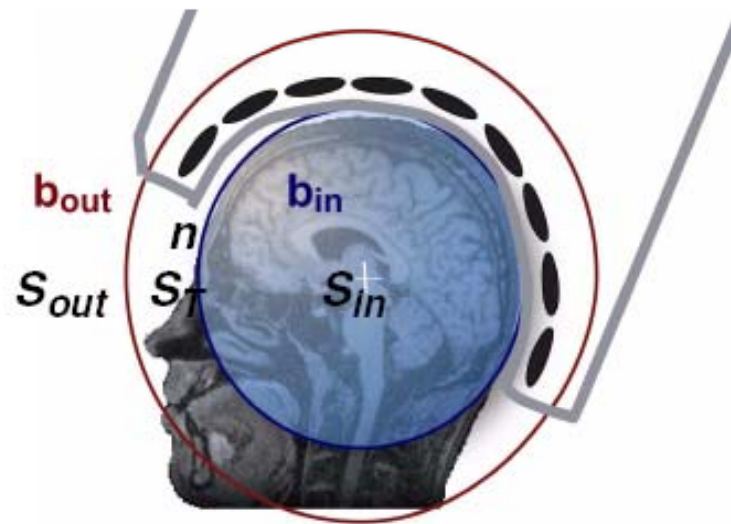
= 'Maxwell' Filtering (Neuromag only)

**Remove noise** from external sources or from within sensor array (Signal Space Separation, SSS)

**Identify and remove (reconstruct) bad sensors**  
Remove high-frequency HPI signal

### Transform head position

- Correct for motion (within a session)
- Align head position across sessions
- Align head position across subjects



$$b = b_{in} + b_{out} + n$$

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**DownsAMPLE**  
(/Filter)

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STATISTICS  
(Talk later in session)

## [ Downsample ]

= Reduce sampling rate (number of points)

### Reduces file size

- Useful if memory-intensive processes planned
- Usually only interested in <50 Hz anyway

**NOTE:** Low-pass filter should be applied first to prevent aliasing (i.e., high-frequency signal expressed as low-frequency modulation)



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STATISTICS  
(Talk later in session)

## [ Identify Artefacts ]

= Identify noise related to physiological signals

### Physiological artefacts w/ regular topographies

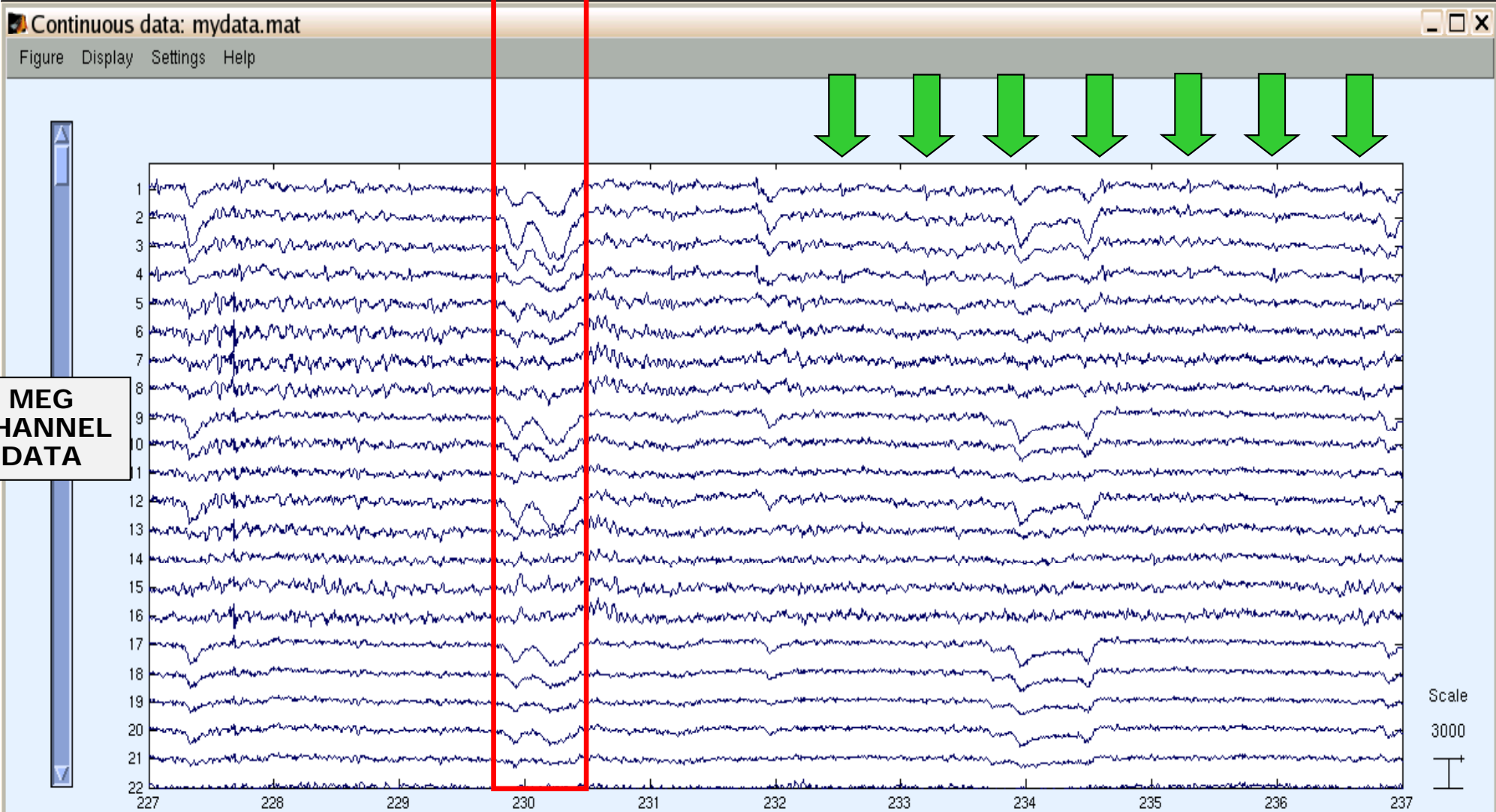
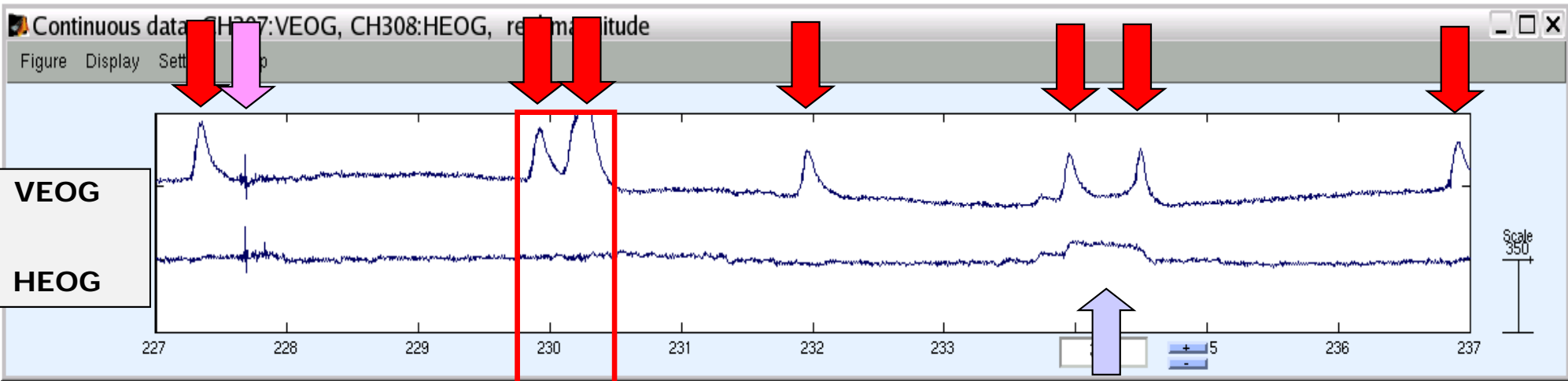
- blink, eye movement, pulse, ...

### Preempt if possible!

- Ask subjects to be still, fixate, not blink
- Can't do much about the pulse, though!

### Record physiological signals

- Compare against MEG channels



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SESSIONS**

**REJECT**

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CONTRAST**

**DISPLAY**  
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**STATISTICS**  
(Talk later in session)

## [ Compensate for Artefacts ]

= Adjust data to 'remove' artefact signal

### Why not just reject?

- Difficult to get clean recordings in some populations
- May have limited number of stimuli/trials

### Different approaches exist:

- Regression method
  - >  $MEG(\text{clean}) = MEG(\text{dirty}) - EOG \times \text{propagation factor}$
- Subtract activity of source dipole @ eyes
- Project out blink-correlated independent component

### Issues:

- Brain signal in EOG?
- Brain signal in blink IC?
- Head movement relative to MEG sensors
  - \*\* MUST apply motion correction \*\*
- Variability in blinks, eye movements
- 'Splitting' of artefact across components



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STATISTICS  
(Talk later in session)

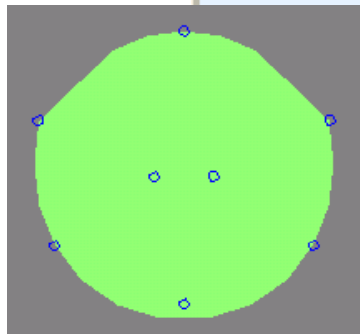
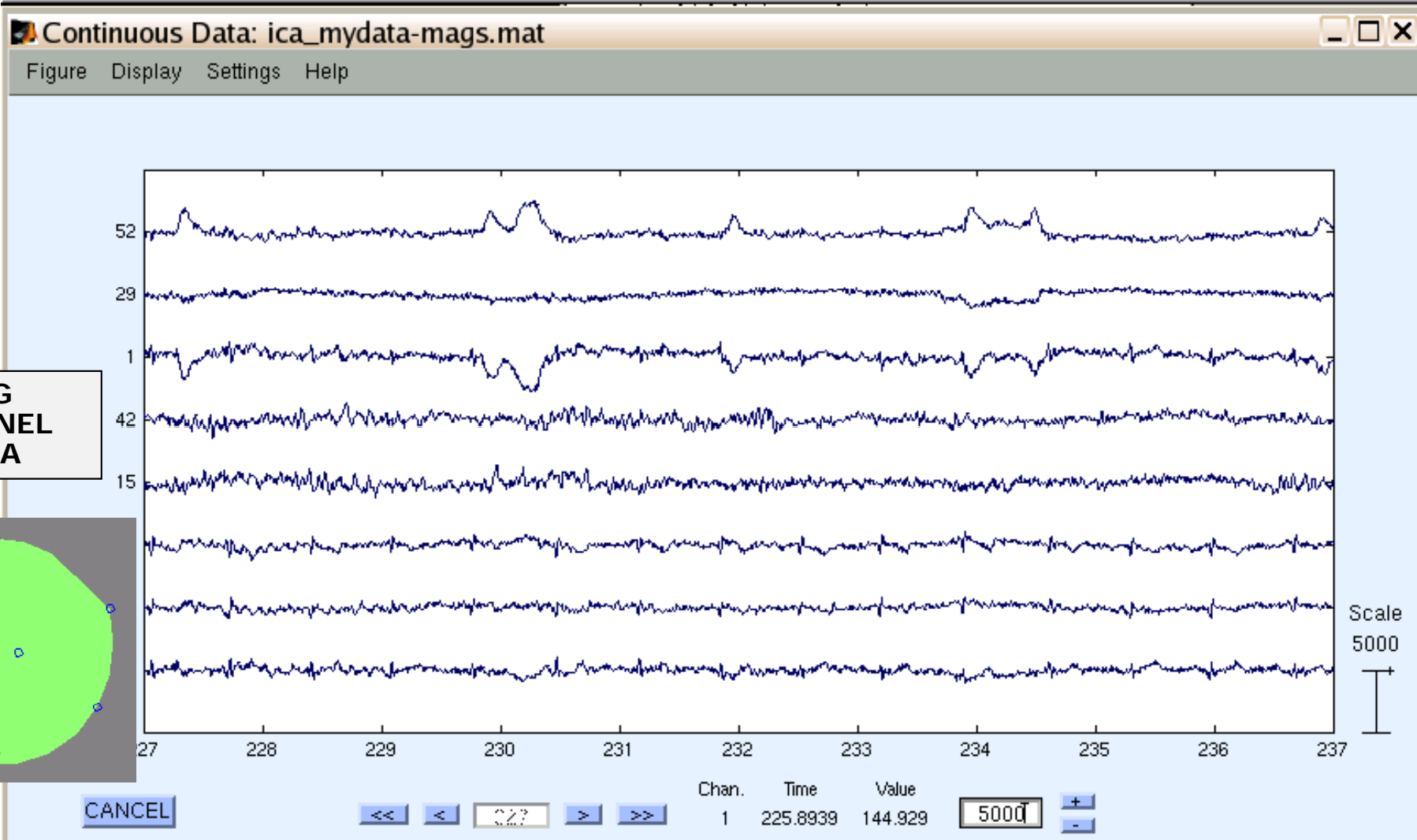
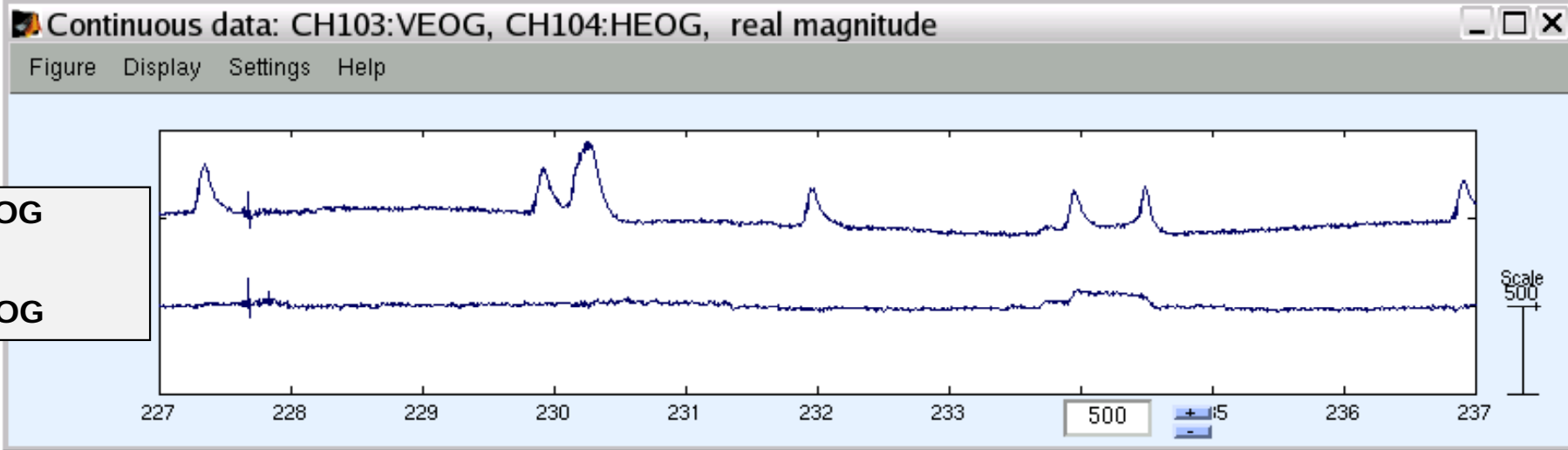
## [ Artefact Compensation with ICA ]

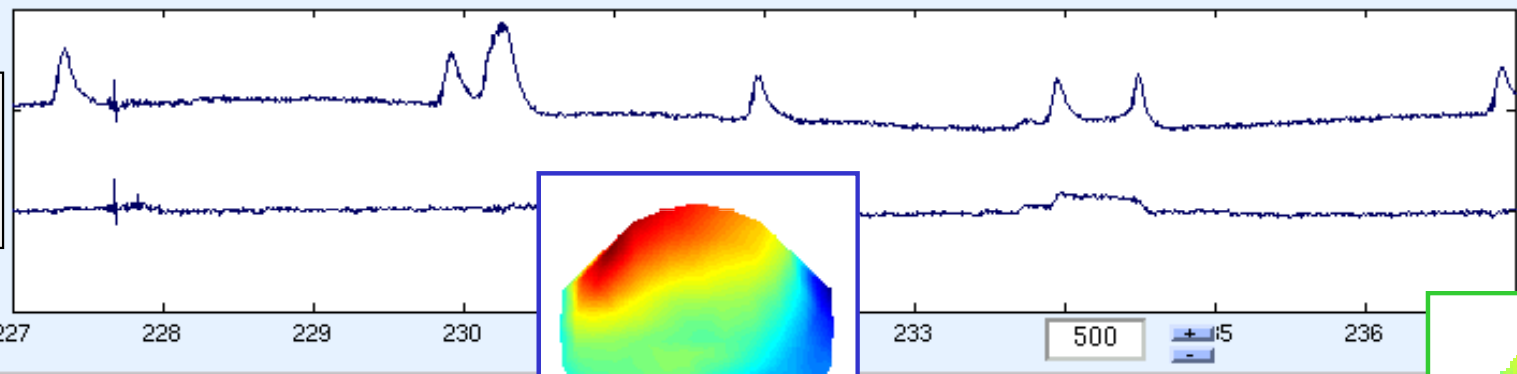
### ICA = Independent Component Analysis

- Separates multi-channel data into independent components (minimised mutual information).  
 $data = A * sources$      $A$  is the 'mixing matrix'  
 $sources = W * data$     where 'unmixing matrix'  $W = A^{-1}$
- Assumes stationary sources with differing timecourses
- Data-driven ('blind' source separation)

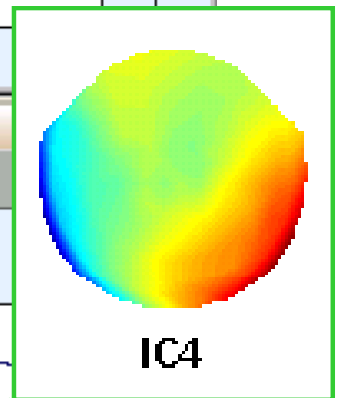
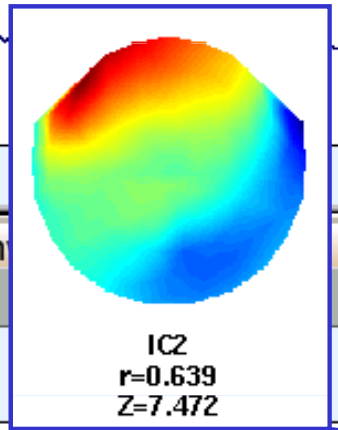
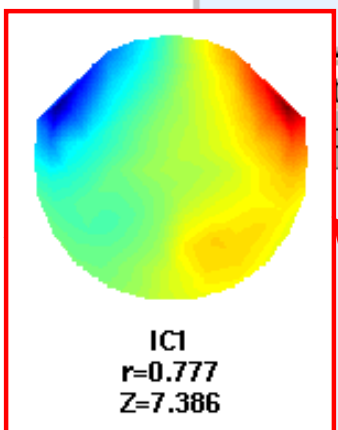
### Semi-Automated identification of 'artefact' ICs

- Correlate IC timecourse w/physiological signals
- Correlate IC topography with artefact template

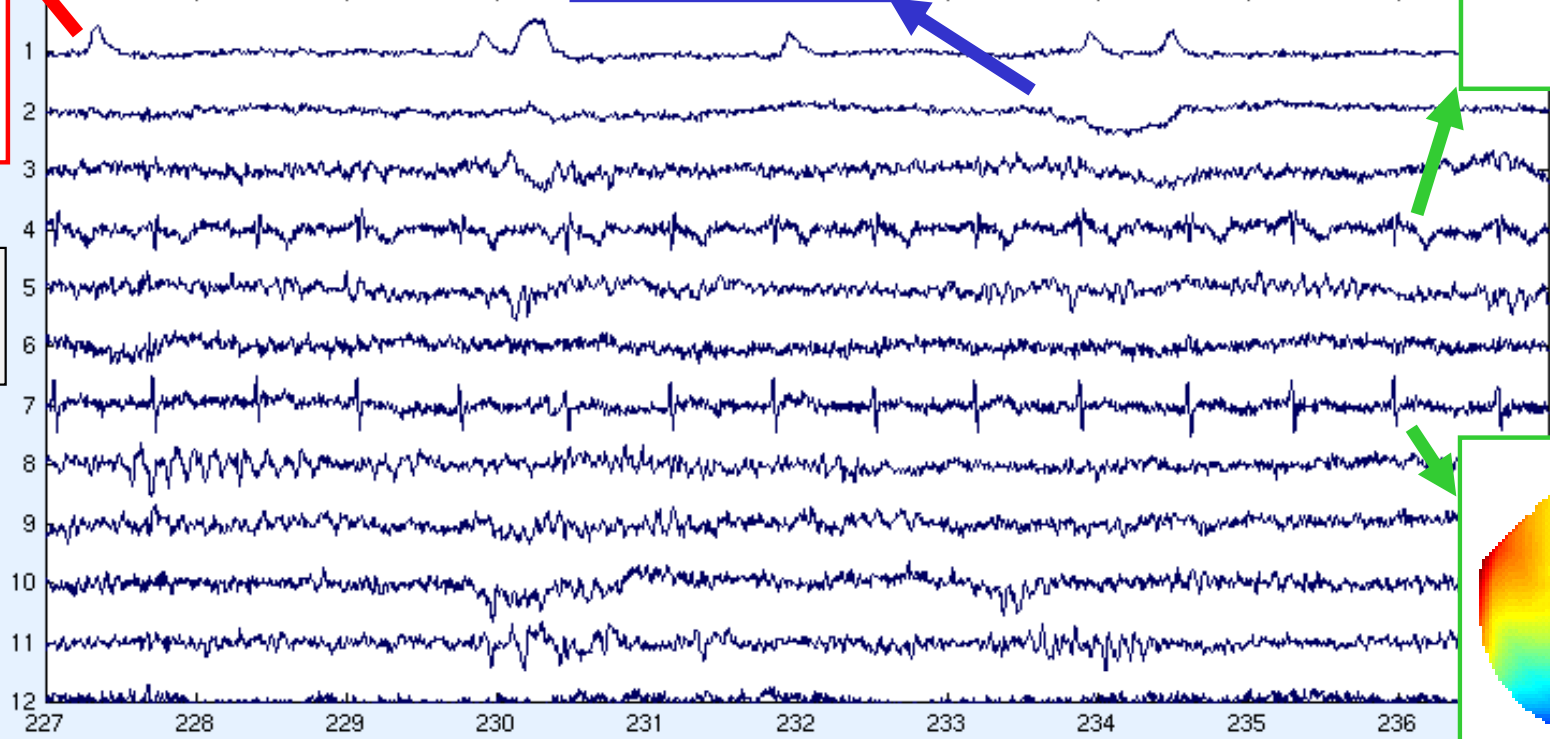




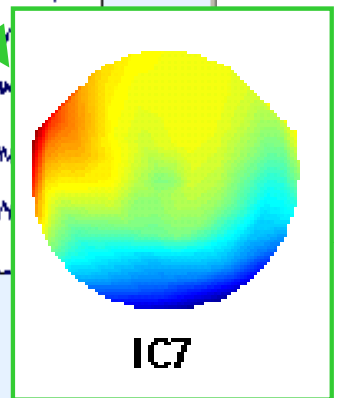
VEOG  
HEOG



Activations of Continuous Data: ica\_m



ICA  
'ACTIVATION'  
TIMECOURSES

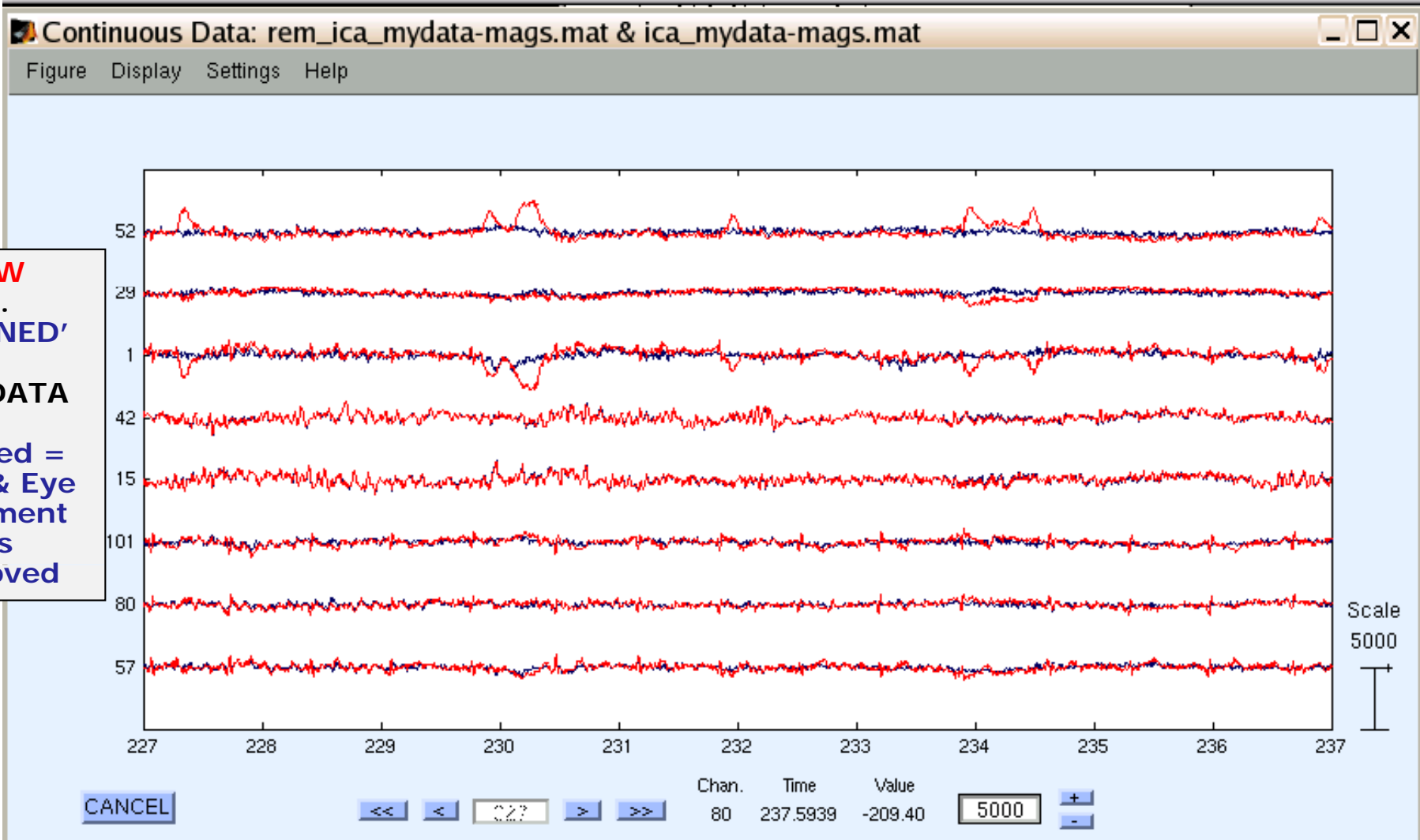
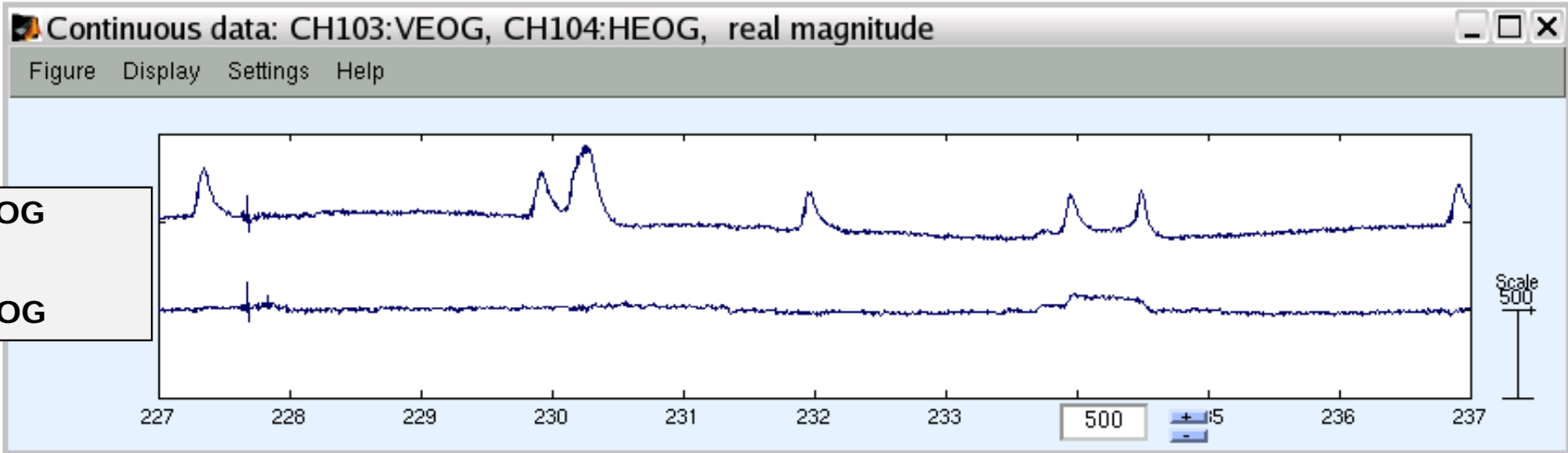


CANCEL

<< < C?? > >>

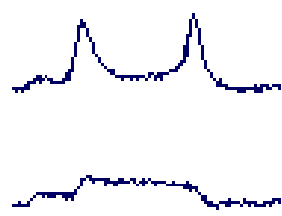
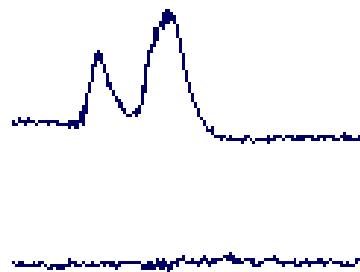
Chan.	Time	Value
1	237.5224	-0.0147

8.1

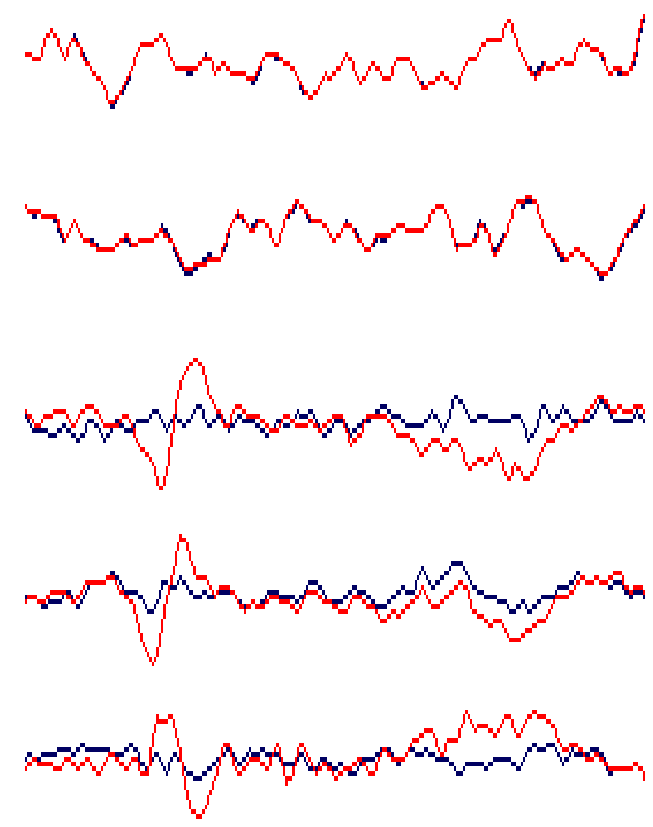
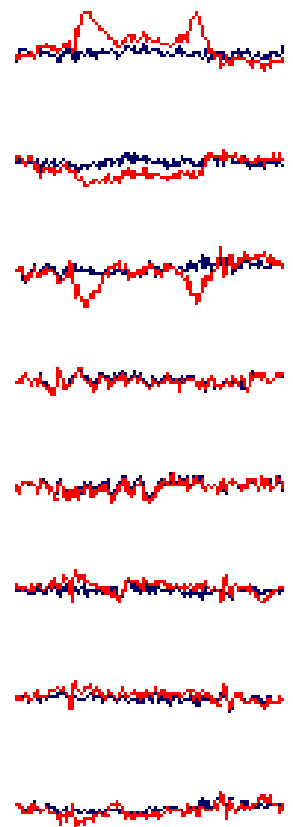
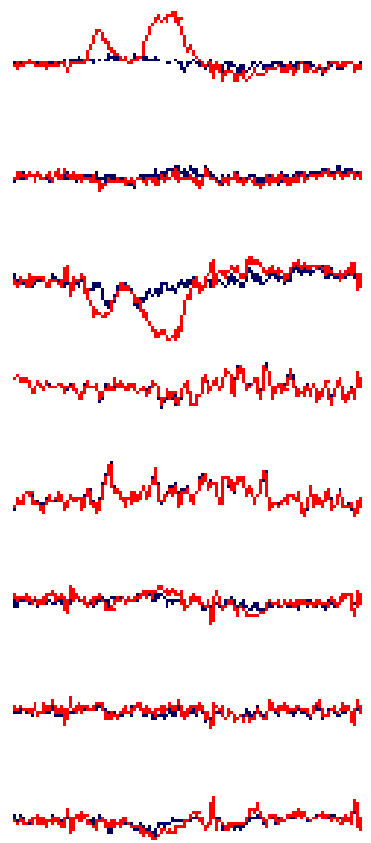


VEOG

HEOG



RAW  
vs.  
'CLEANED'  
MEG DATA



Blink & Eye  
Movement  
ICs  
Removed

Pulse ICs  
Removed

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(/Filter)

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3D Volume

**STATISTICS**  
(Talk later in session)

## [ Artefact Compensation with ICA ]

### ICA = Independent Component Analysis

- Separates multi-channel data into independent components (minimised mutual information).
- Assumes stationary sources with differing timecourses
- Data-driven ('blind' source separation)

### Semi-Automated identification of 'artefact' ICs

- Correlate IC timecourse w/physiological signals
- Correlate IC topography with artefact template

### Issues:

- How many components?
  - \* rank of data < # chans
- Filter/Reject first?
  - \* Works better on cleaner data (free of one-off noise events, e.g., cough, shift of position)
  - \* But can use high-frequency information
  - \* Continuous data easier to interpret

### Limitations:

- Head position must be constant!
- Works very well for blinks (high signal), well for eye movements, well for pulse
- Effects on source localisation unexplored

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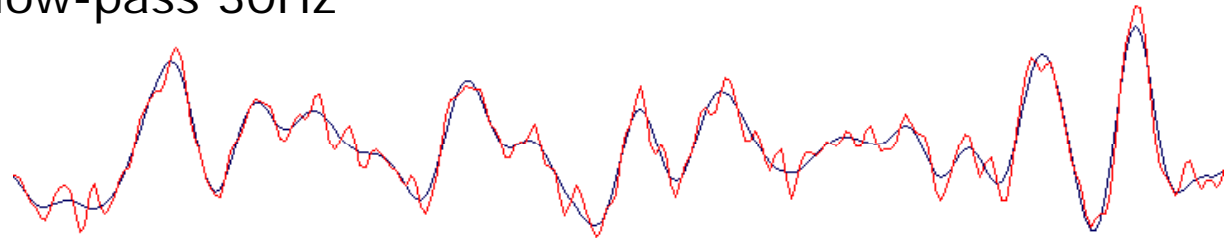
**STATISTICS**  
(Talk later in session)

## [ Filter ]

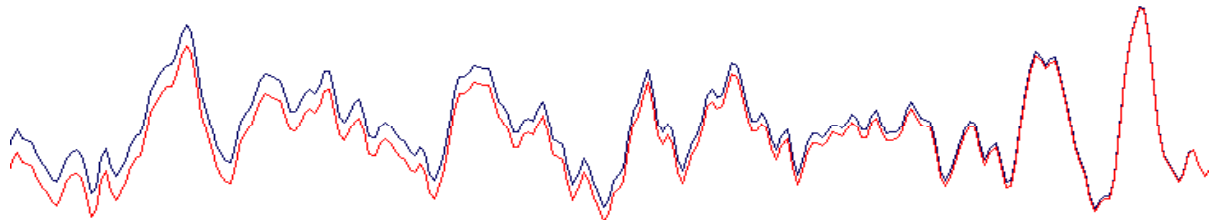
= Remove high-frequency noise and/or low-frequency drift

**Often used for visualisation only**

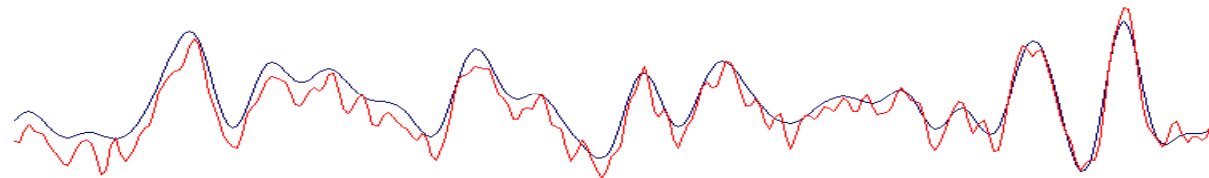
low-pass 30Hz



high-pass 0.5Hz



band-pass 0.5 – 30Hz



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**STATISTICS**  
(Talk later in session)

## [ Epoch ]

= Cut up data into stimulus- or response-locked segments

### Size depends on what you are studying

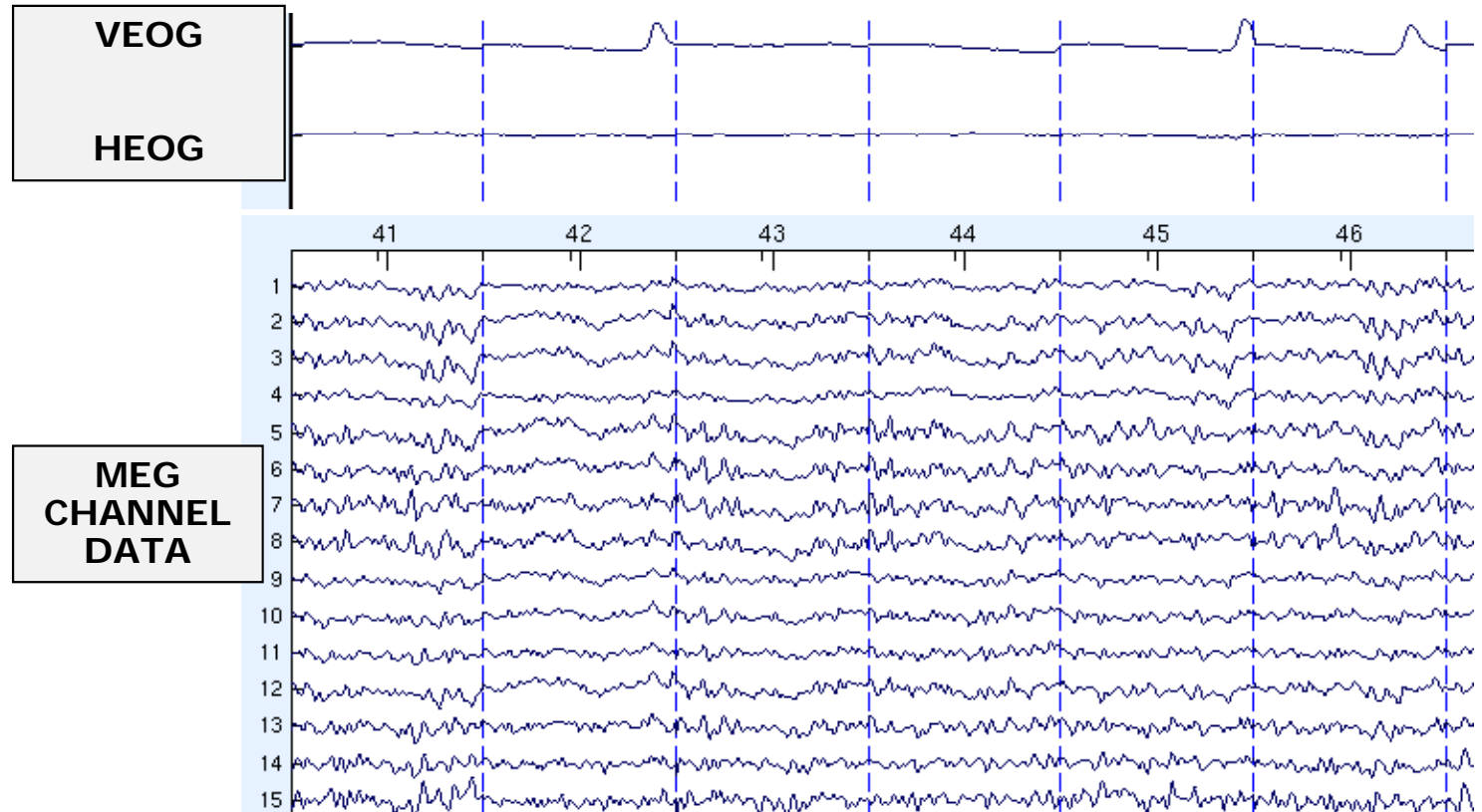
- Time-Frequency: long epochs (to avoid edge effects)
- If ICA after epoching: long epochs

### Baseline-period

- Should be free of stimulation, responses

### Jitter ISI between critical and preceding stimuli

- Avoid phase-locking induced by stim, anticipatory responses





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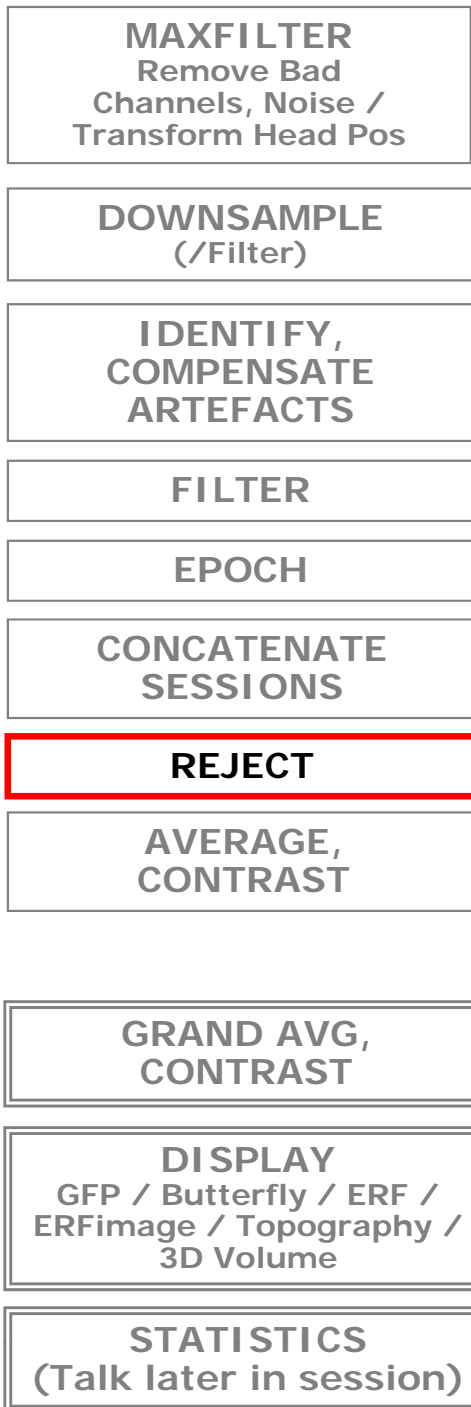
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**STATISTICS**  
(Talk later in session)

## [ Concatenate Sessions ]

= Stick multiple sessions (same subject) together into one

**Note: head position must be the same across sessions!**



## [ Reject ]

= Remove noisy epochs from further analysis

### Even after artefact compensation...

- unaccounted-for physiological (or other) artefacts remain
- remove epochs with, e.g., blinks during stimulus

### Decision may be based on:

- Hard thresholds (common or subject-specific)
- Statistical outliers
- Eye / expert judgement ( \*gasp\* )

### Alternative to rejection: Robust Averaging (SPM)

- weight points by similarity to mean

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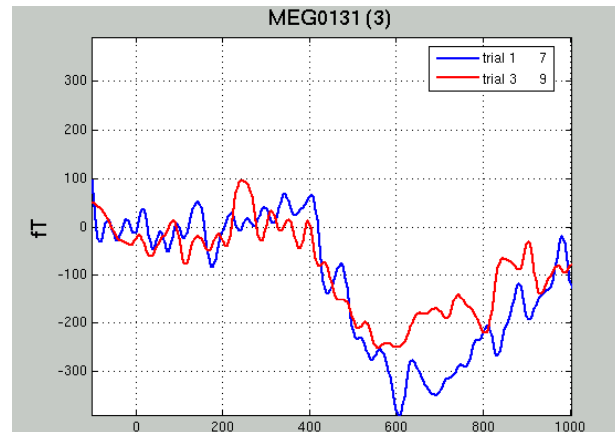
**STATISTICS**  
(Talk later in session)

## [ Average/Contrast ]

= Compute mean timecourse over epochs of same condition,  
or apply contrast to compare/combine conditions  
(as in SPM GLM for fMRI)

### Theory:

- ERF/P = 'signal'; background M/EEG = noise
- Averaging increases signal:noise
- Compute point-to-point average



### Problems:

- Can't be sure this is true since it relies on averaging!
- Latency jitter flattens averages

### Alternatives:

- Analyse EEG (power in different frequency bands)
- Visualise epochs

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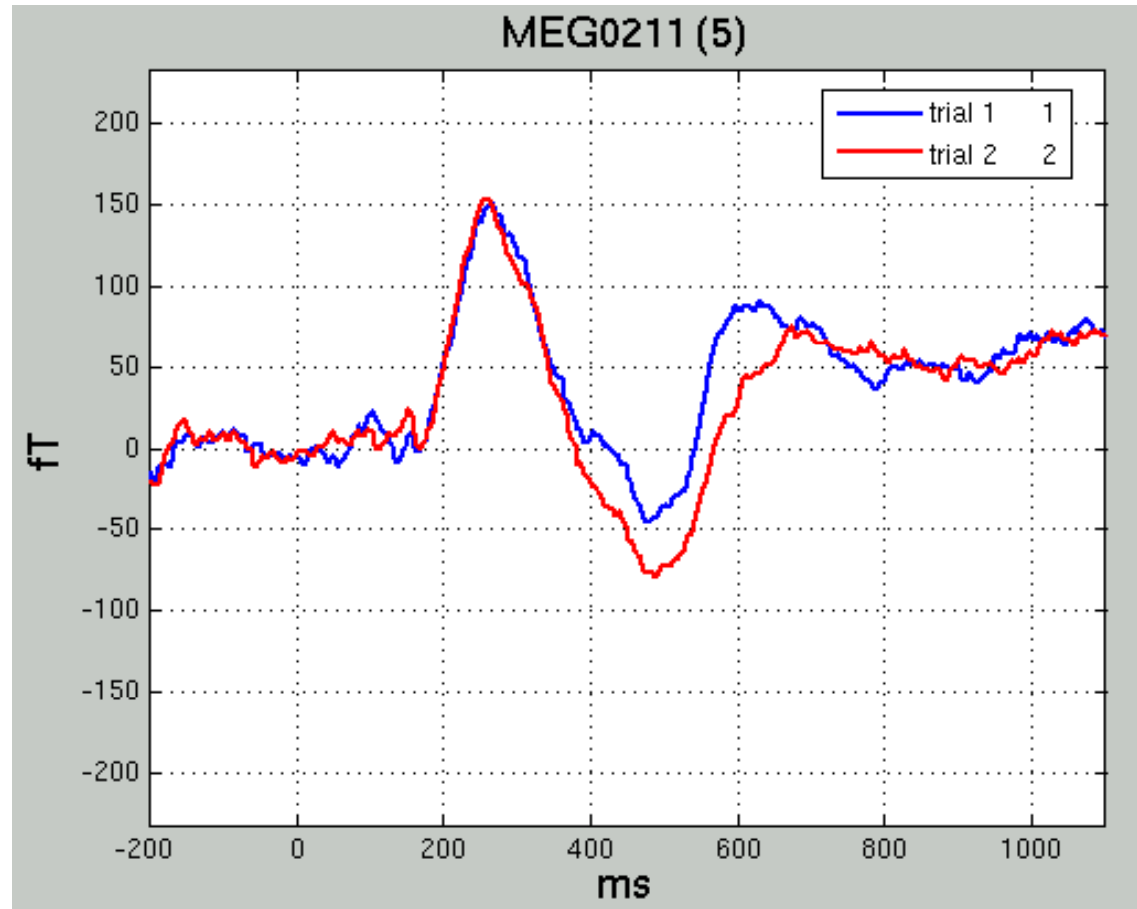
**GRAND AVG,  
CONTRAST**

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**STATISTICS**  
(Talk later in session)

## [ Grand Average by Condition ]

= Average (or contrast) of subjects' condition averages



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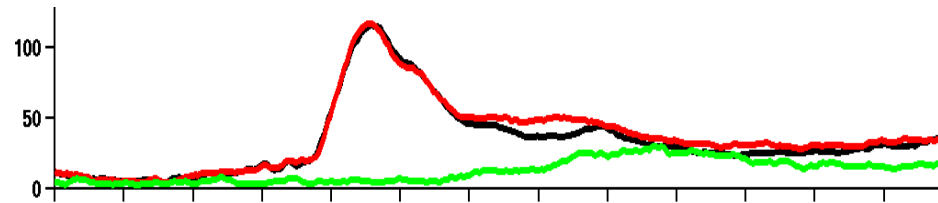
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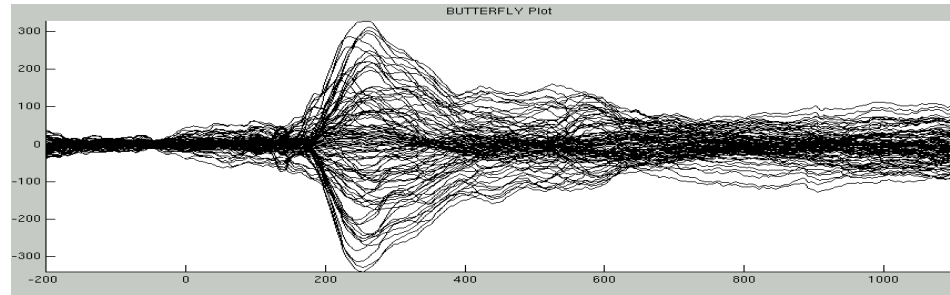
**STATISTICS**  
(Talk later in session)

## [ Display Data ] – Timecourse

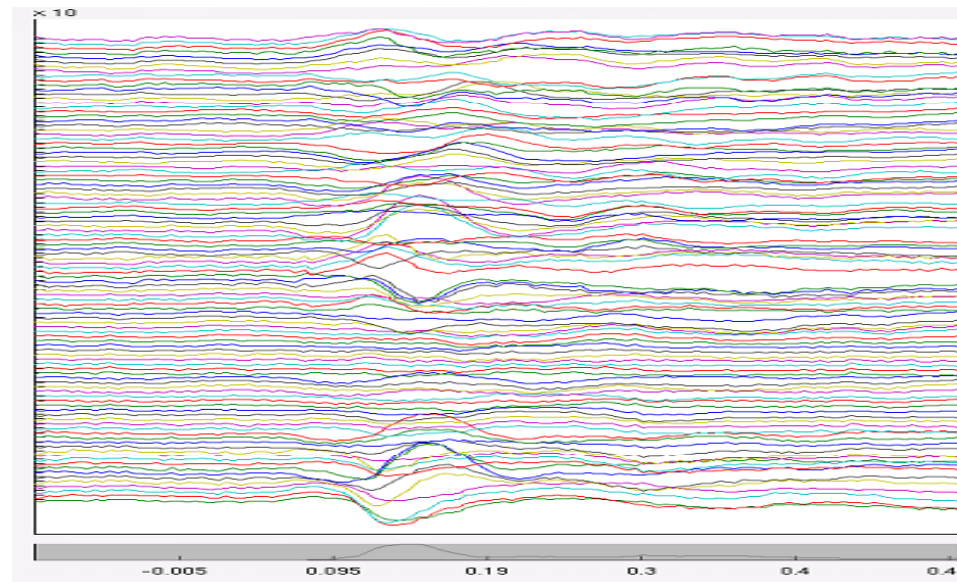
**Global Field Power (GFP)** = Power collapsed over space



**Butterfly Plot** = all sensors superimposed



**Event-Related Field (ERF)** = timecourse at each sensor



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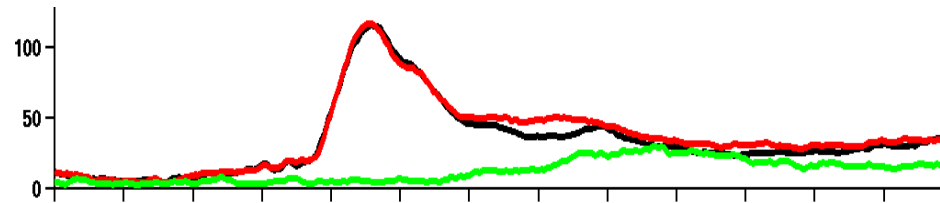
**GRAND AVG,  
CONTRAST**

**DISPLAY**  
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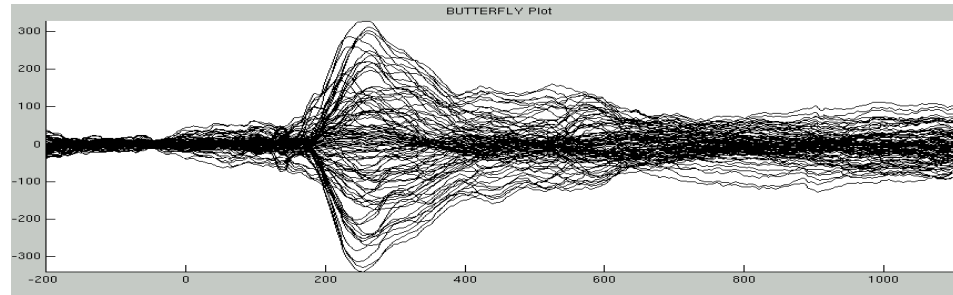
**STATISTICS**  
(Talk later in session)

## [ Display Data ] – Timecourse

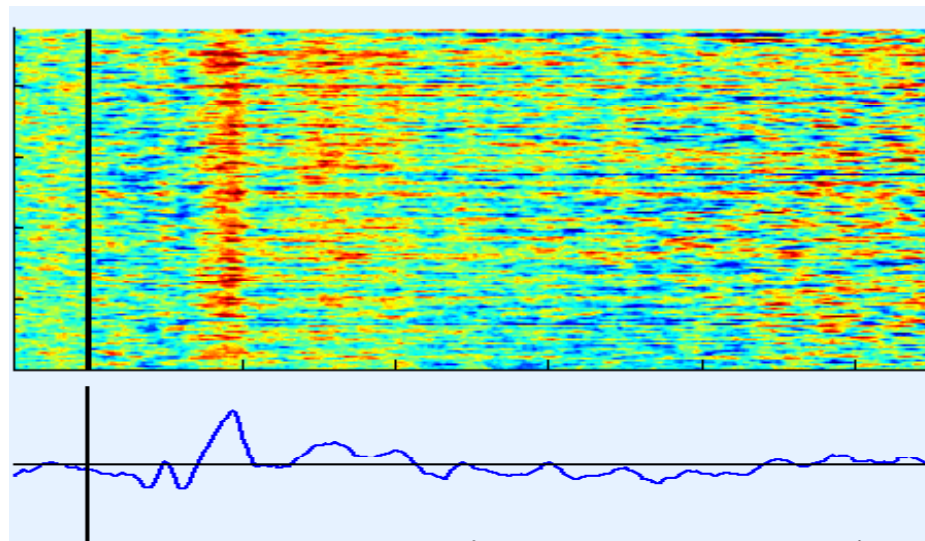
**Global Field Power (GFP)** = Power collapsed over space



**Butterfly Plot** = all sensors superimposed



**ERFimage** = each trial (/subject) at 1 sensor as scaled image



**MAXFILTER**  
Remove Bad  
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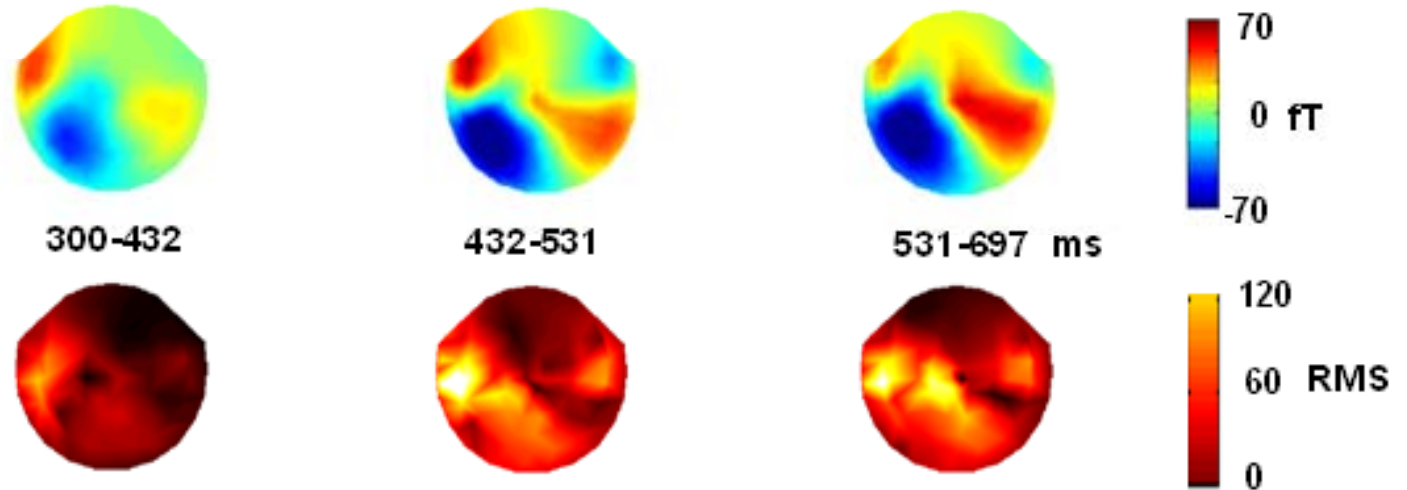
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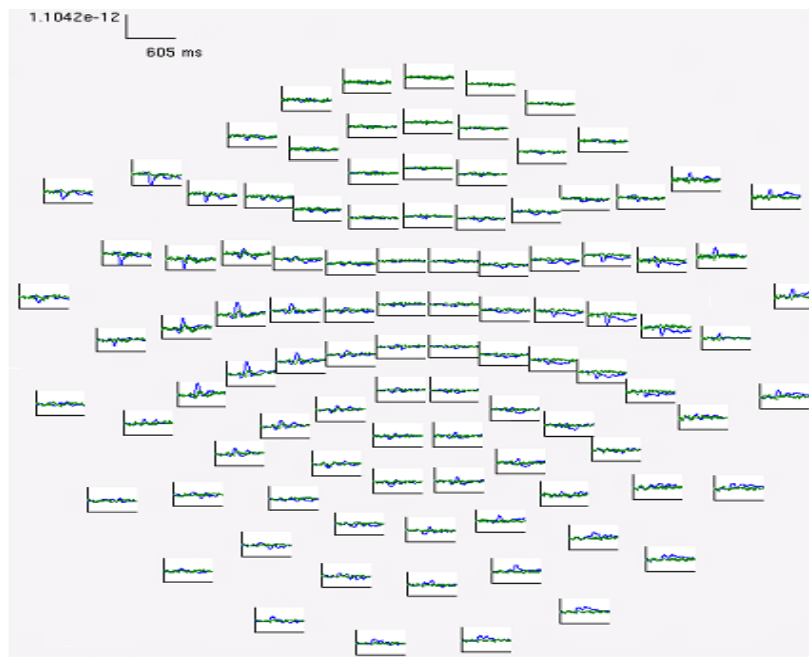
**STATISTICS**  
(Talk later in session)

## [ Display Data ] – Spatial Distribution

**Topography** = spatial distribution of field at points in time



**Event-Related Field (ERF)** = timecourse at all sensors



MAXFILTER  
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Transform Head Pos

DOWNSAMPLE  
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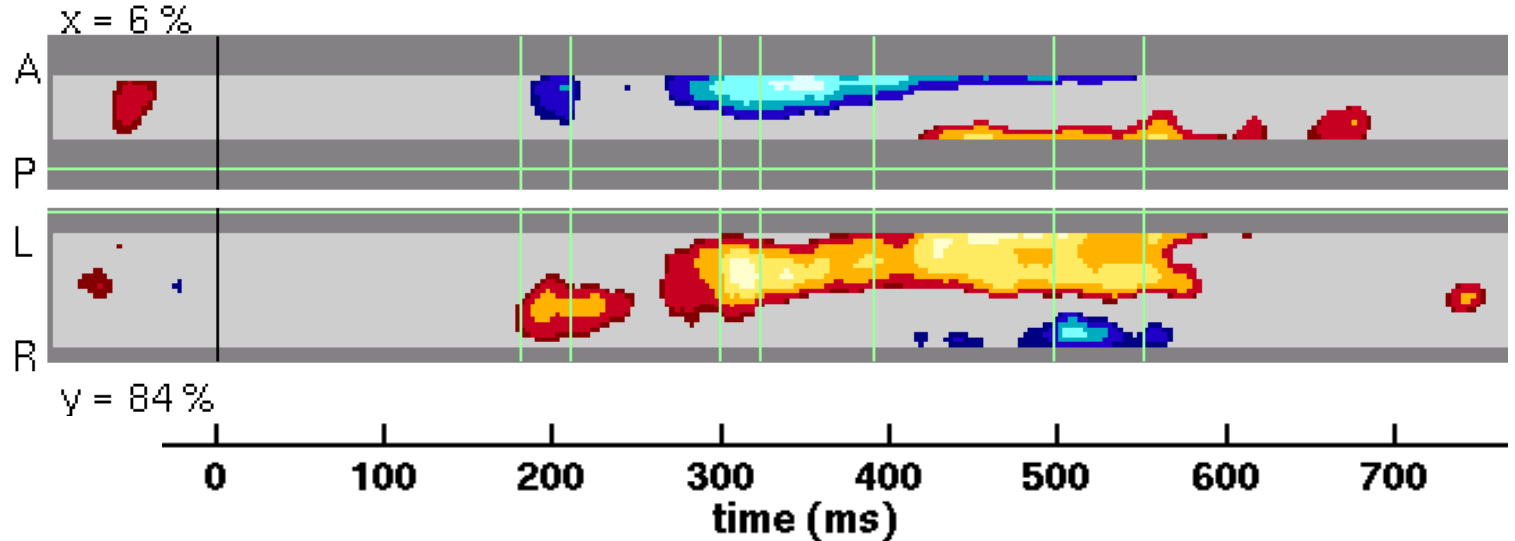
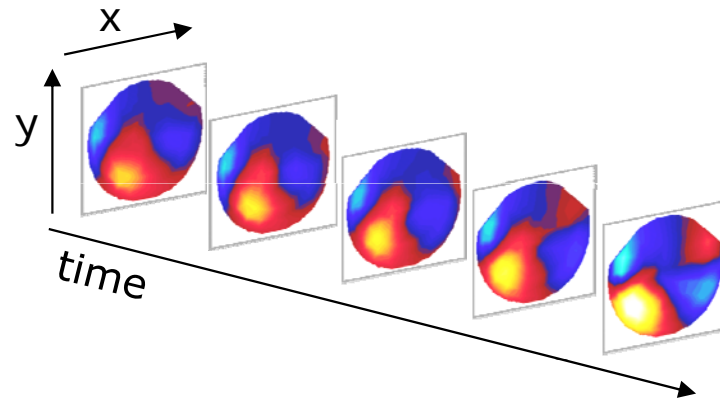
**DISPLAY**  
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STATISTICS  
(Talk later in session)

# [ Display Data ] – Timecourse AND Spatial Distribution

## Topography-by-Time Images

= Image volumes formed by layering topographies from each time point (imagine a stack of poker chips)





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**STATISTICS**  
(Talk later in session)

# -- The end --



- Thanks for listening
- Acknowledgements:
  - Rik Henson (MRC CBU)
  - Vladimir, Karl, and the FIL Methods Group
- More info:
  - **CBU wiki:** <http://imaging.mrc-cbu.cam.ac.uk/meg>
  - **SPM:** <http://www.fil.ion.ucl.ac.uk/spm>
  - **EEGLAB (ICA):** <http://sccn.ucsd.edu/eeglab>
  - **Book:** [An Introduction to the Event-Related Potential Technique](#) by Steve Luck



[jason.taylor@mrc-cbu.cam.ac.uk](mailto:jason.taylor@mrc-cbu.cam.ac.uk)