

# Neural Networks to Consumer Networks: EEG in Research and Marketing

Introduction to ERP Analysis using EEGLAB

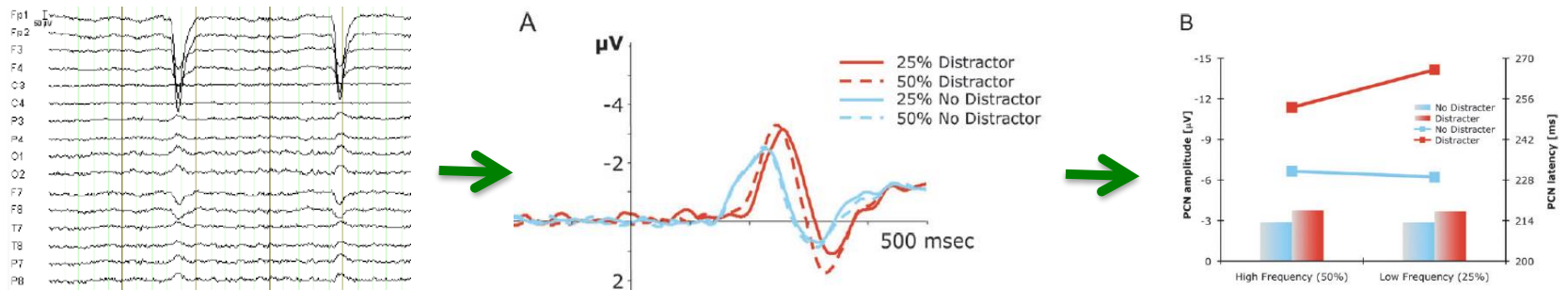
Dr. Artyom Zinchenko

PART II

MUNICH-ÇANAKKALE 2026

15.04.2026

# Main aims of the next 2 sessions ...



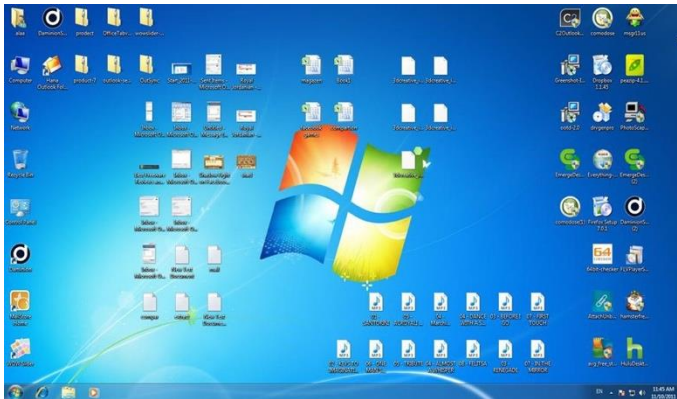
1a: How to extract ERPs from ongoing EEG?

1b: How to visualize ERPs?

2a: How to compute ERP amplitudes & latencies?

2b: How to analyze ERP data statistically?

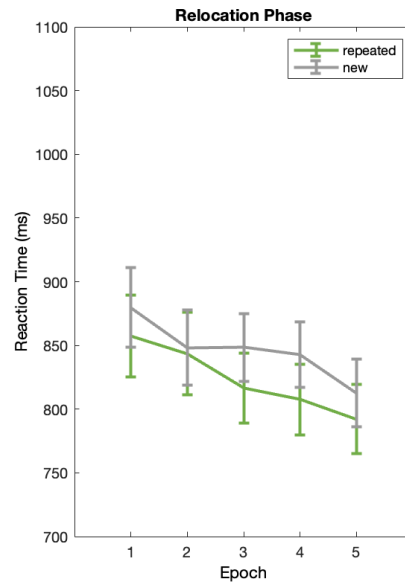
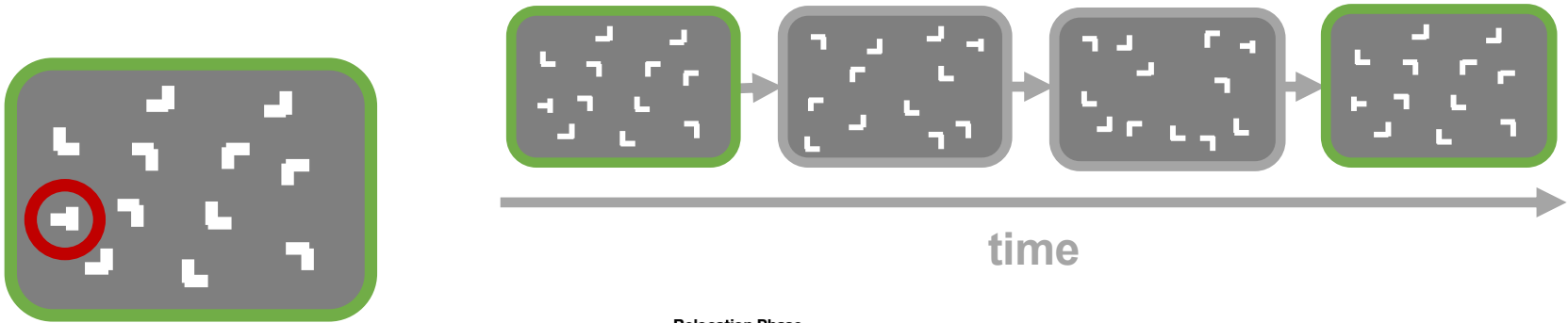
# Paradigm: Contextual Cueing



# Paradigm: Contextual Cueing

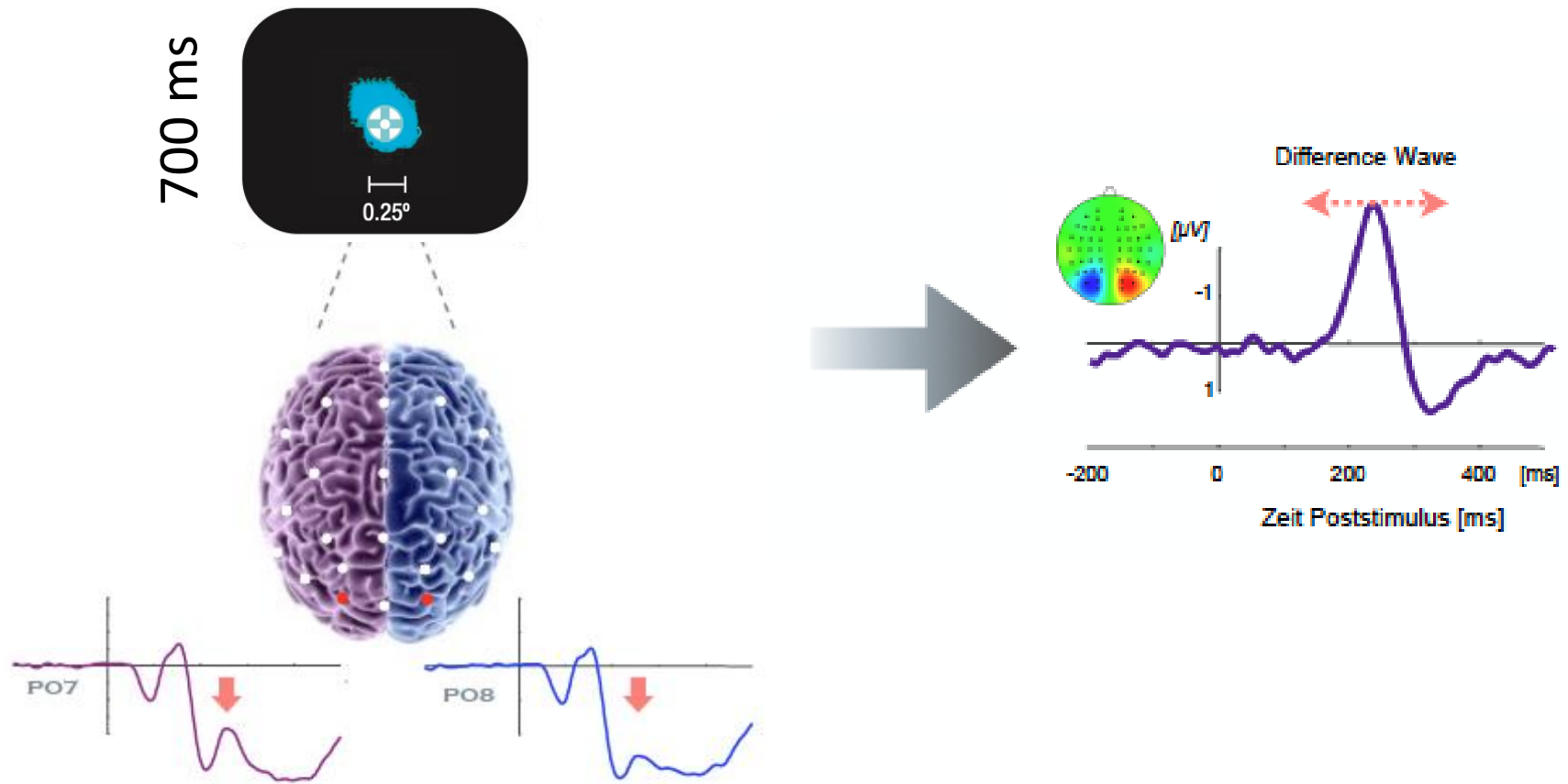
**Repeated display: same array, same target location**

**Non-repeated display: different array, same target location**

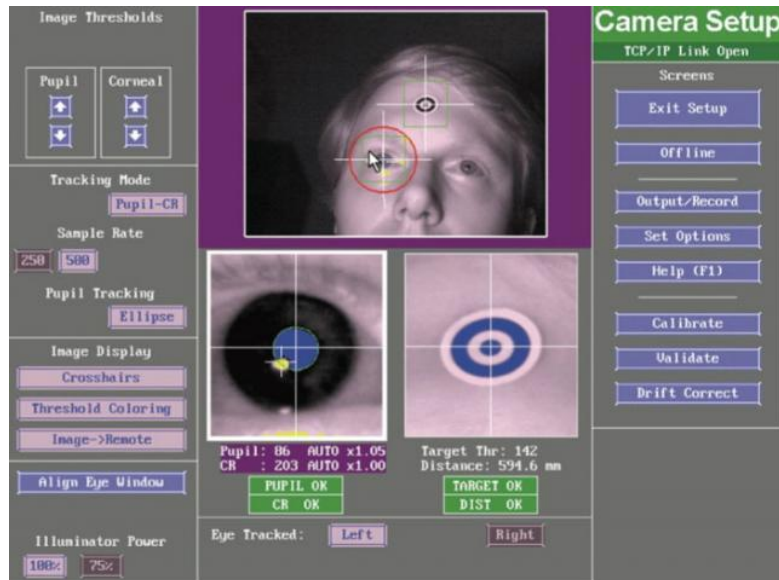




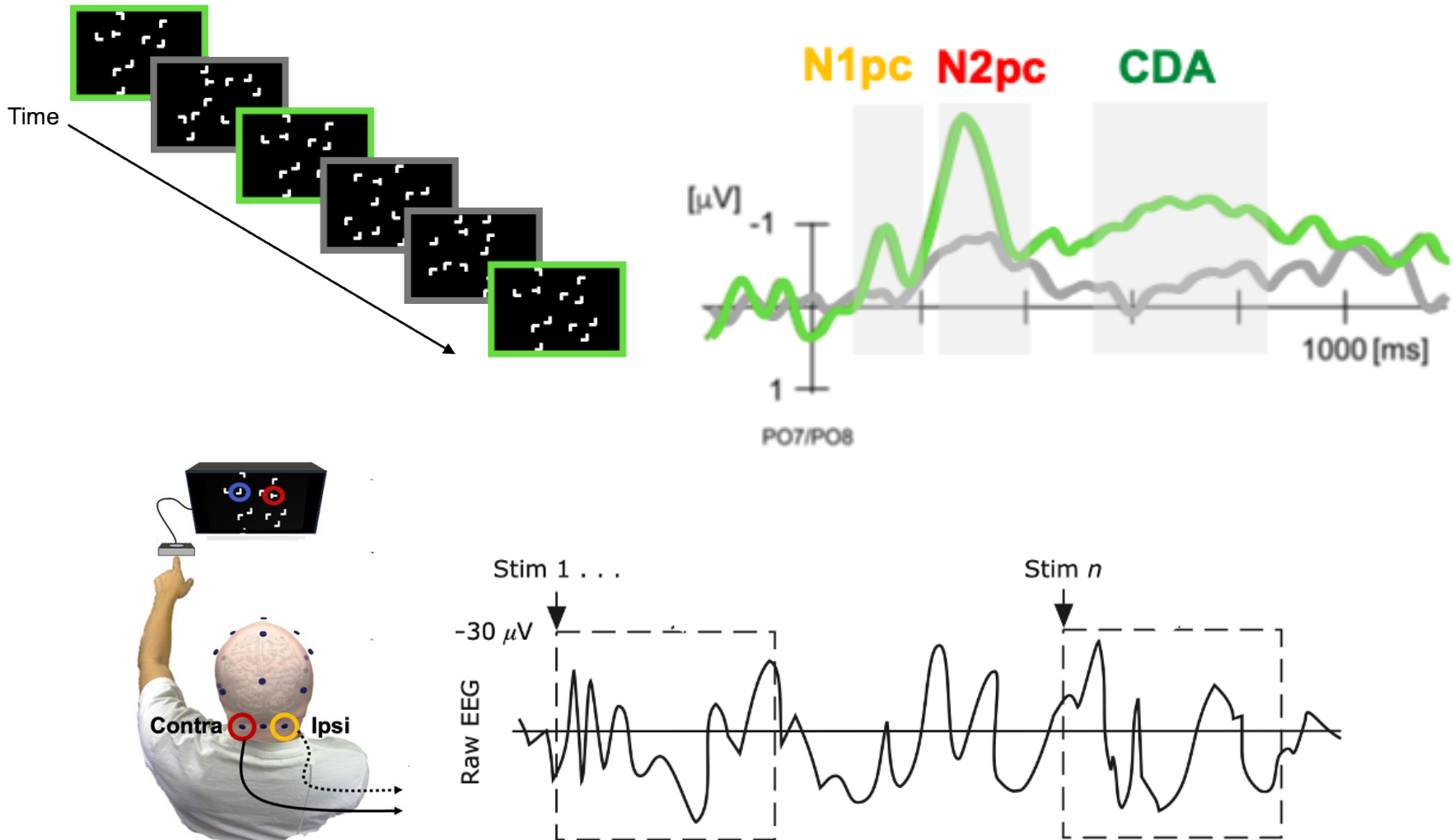
# Neural correlates of contextual modulation of attention



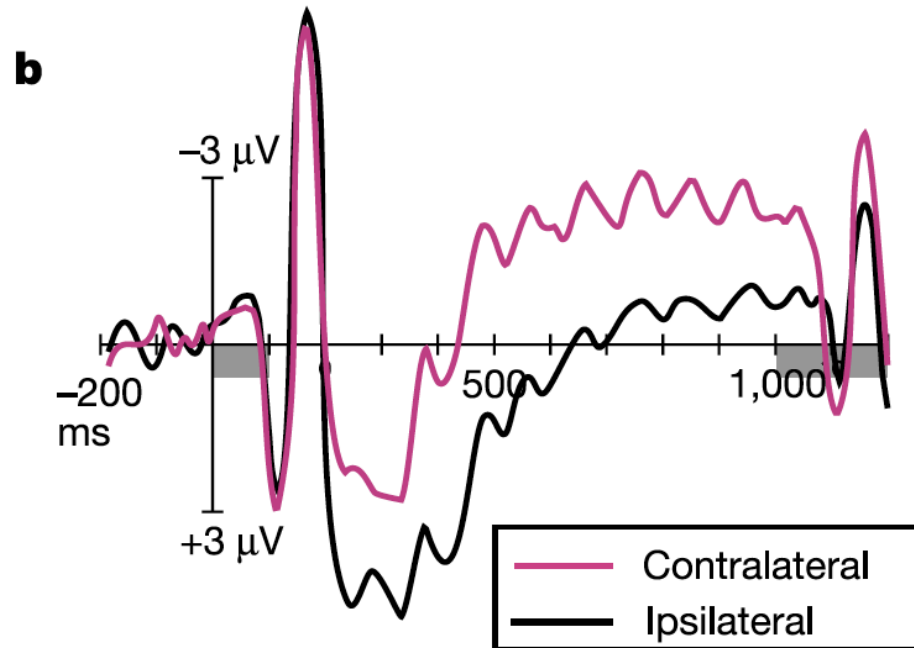
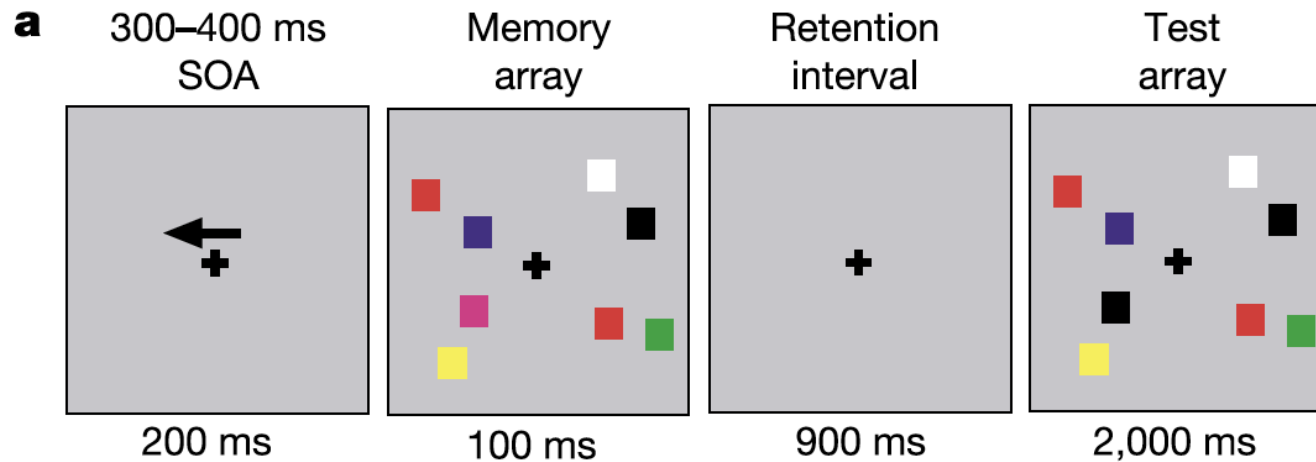
# Neural correlates of contextual modulation of attention



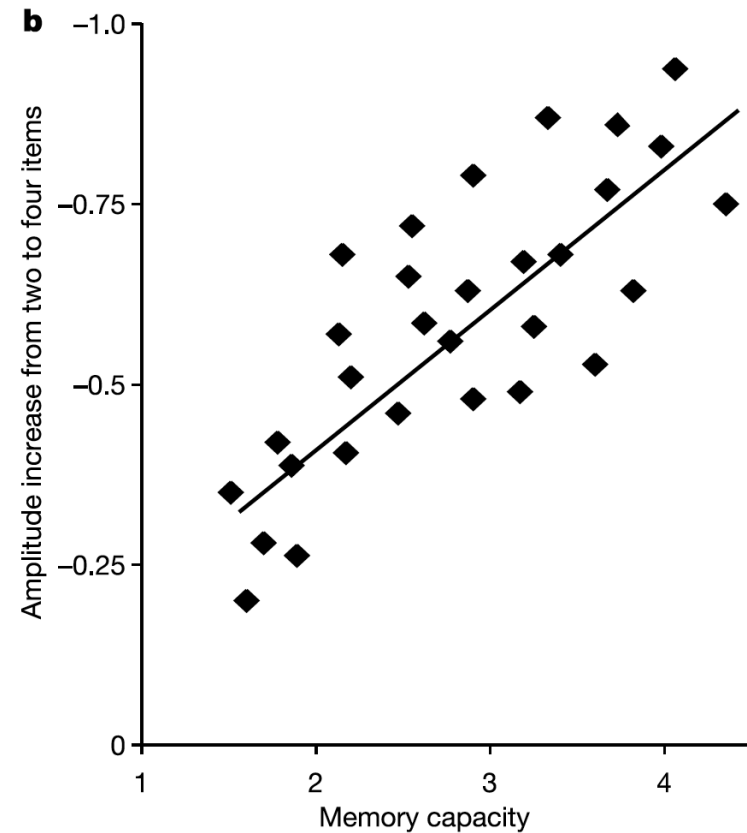
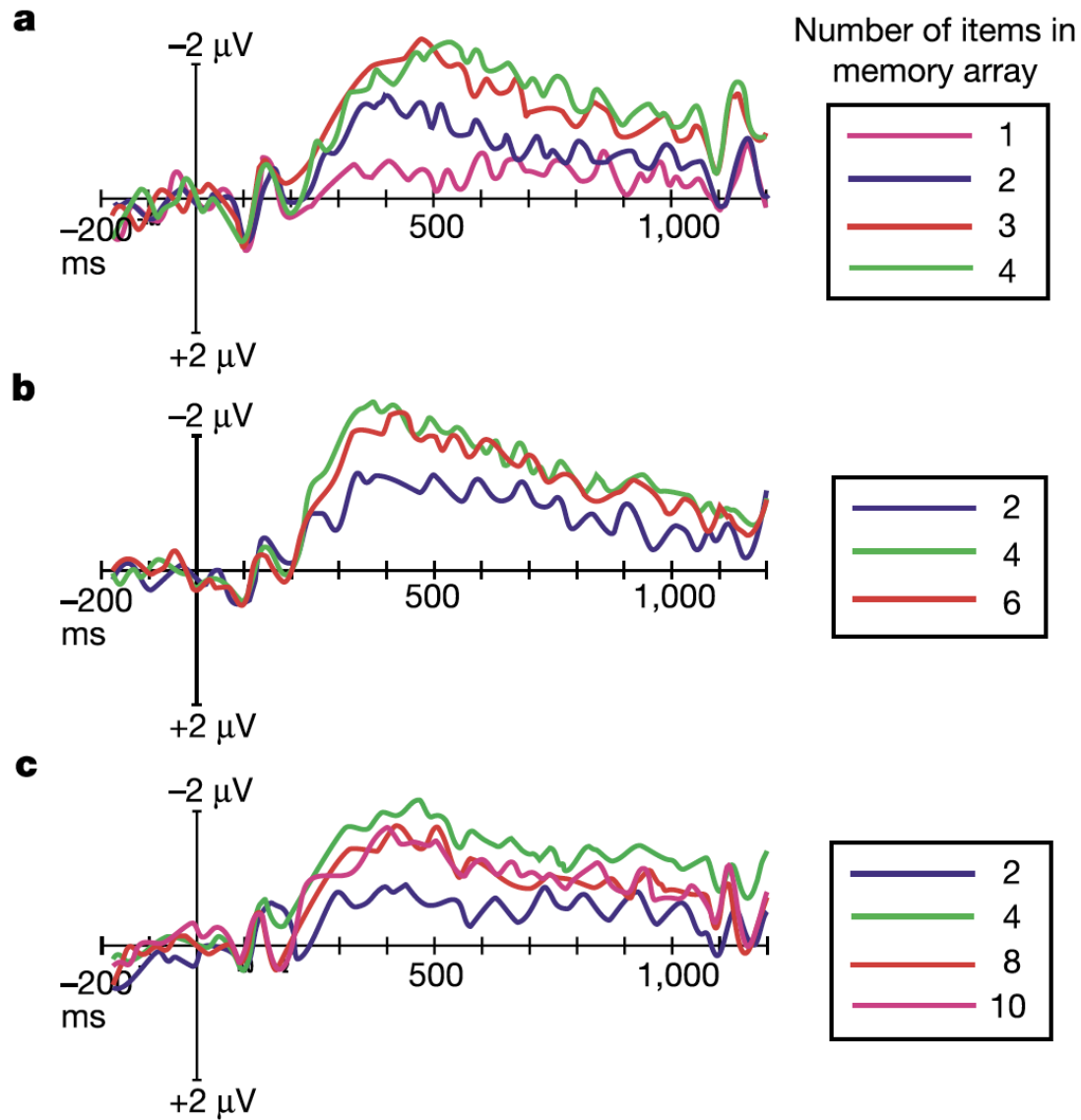
# Neural correlates of contextual modulation of attention



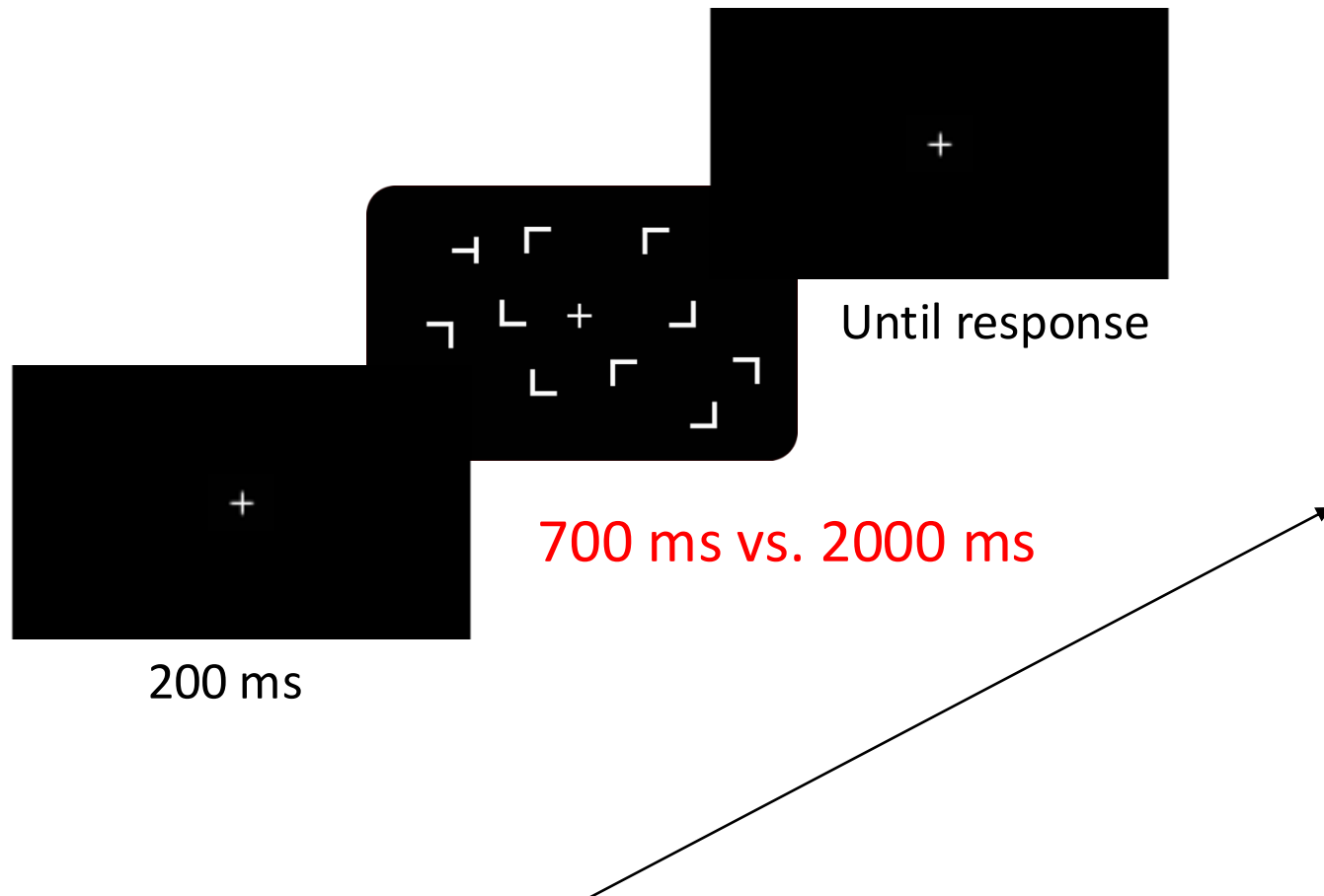
# CDA and working memory



# CDA and working memory



# Neural correlates of contextual modulation of attention





- EEG data need pre-processing before we can report them through graphs and run statistics on them.

# EEG pre-processing software

## Commercial

Brain Vision Analyzer



Neuroscan



[https://mne.tools/table/\\_images/mne\\_logo.svg](https://mne.tools/table/_images/mne_logo.svg)

## Open source

EEGLAB

<http://sccn.ucsd.edu/eeglab>



ERPLAB

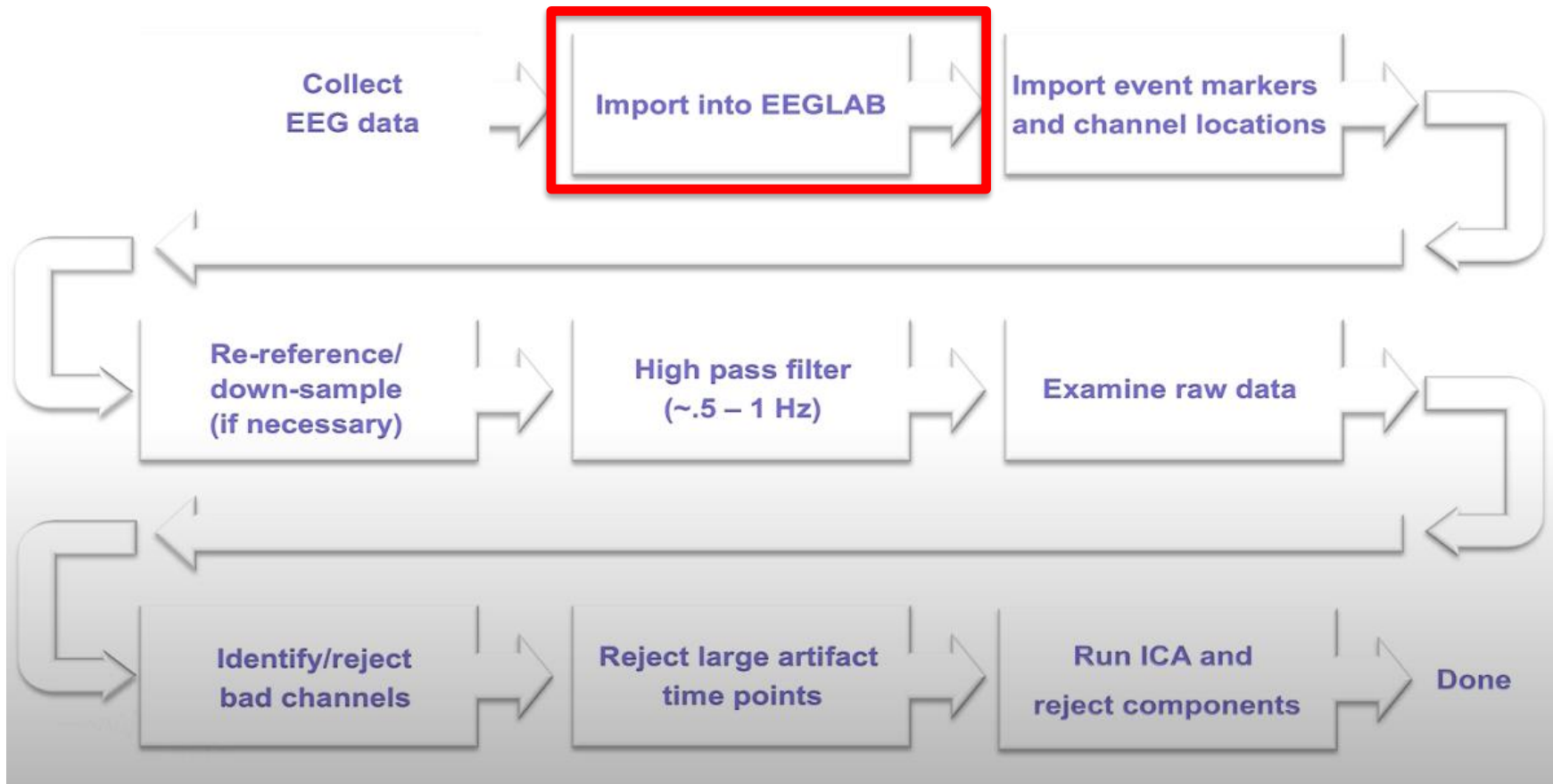
<http://erpinfo.org/erplab>



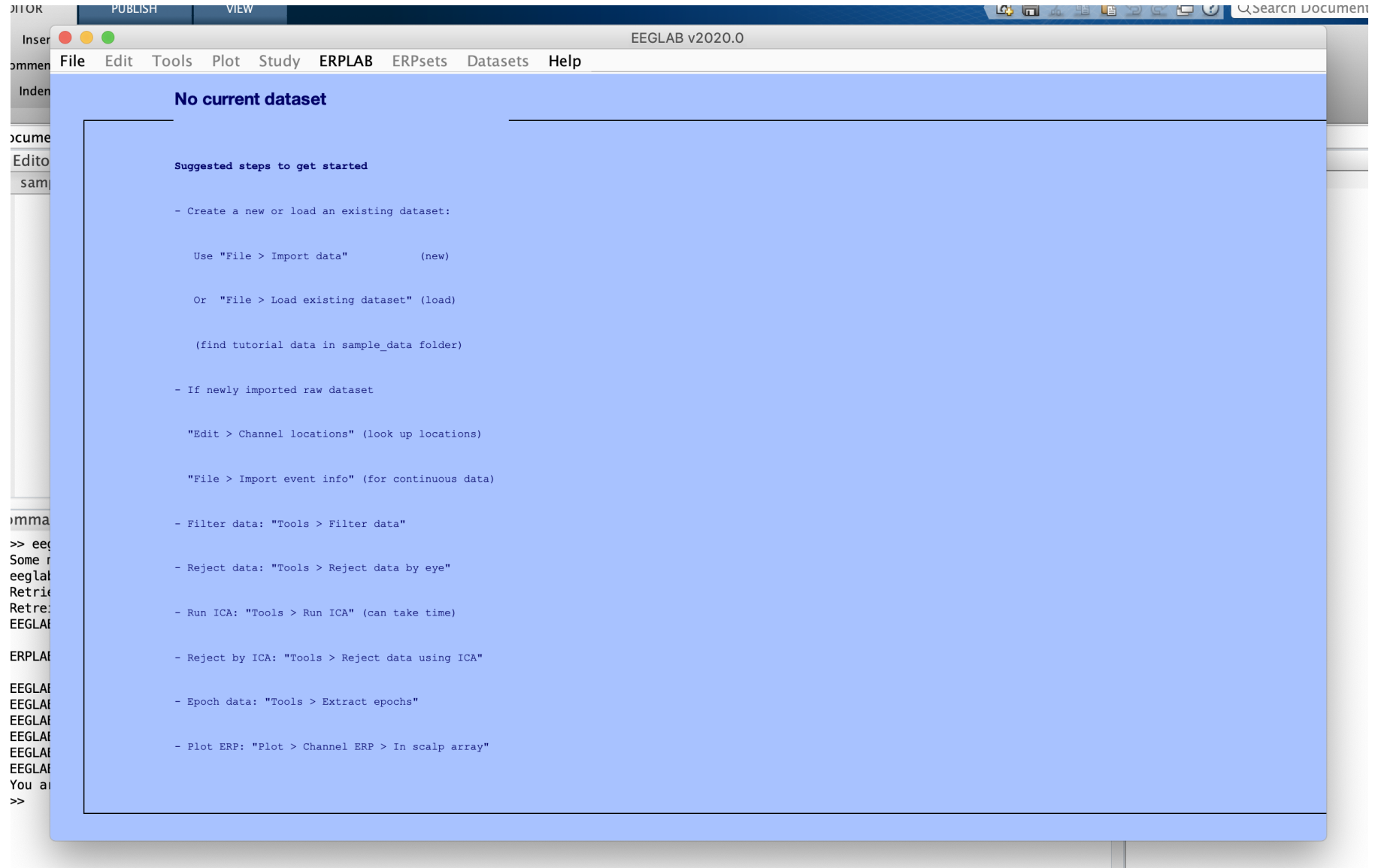
# Overview

- 1. Basic preprocessing with EEGLAB
  - Read-in raw EEG file
  - Import event marker and channel locations
  - Re-reference
  - Filter
  - Reject artifact and bad channels
  - ICA
- 2. Advanced options with ERPLAB

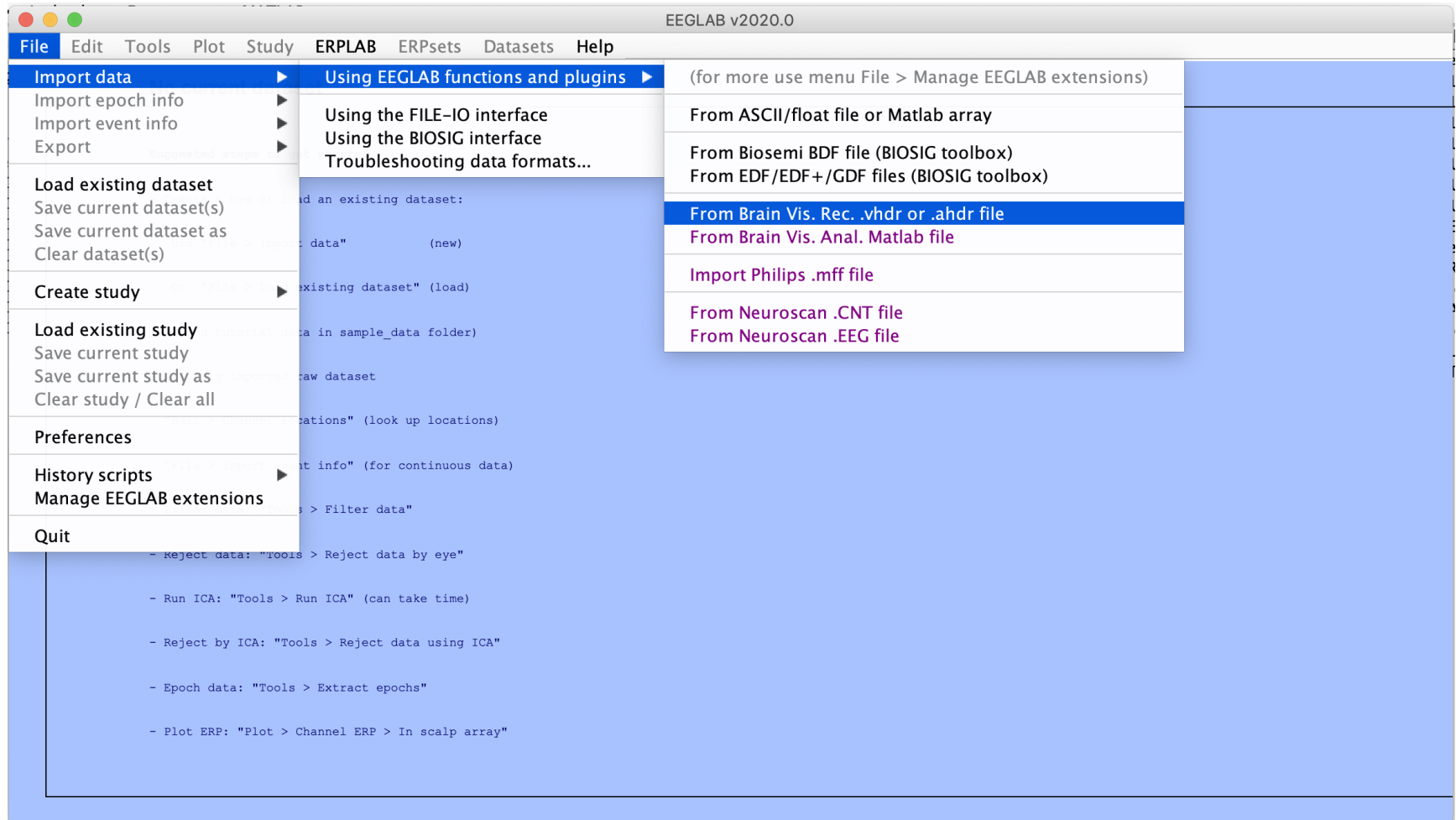
# EEG pre-processing steps



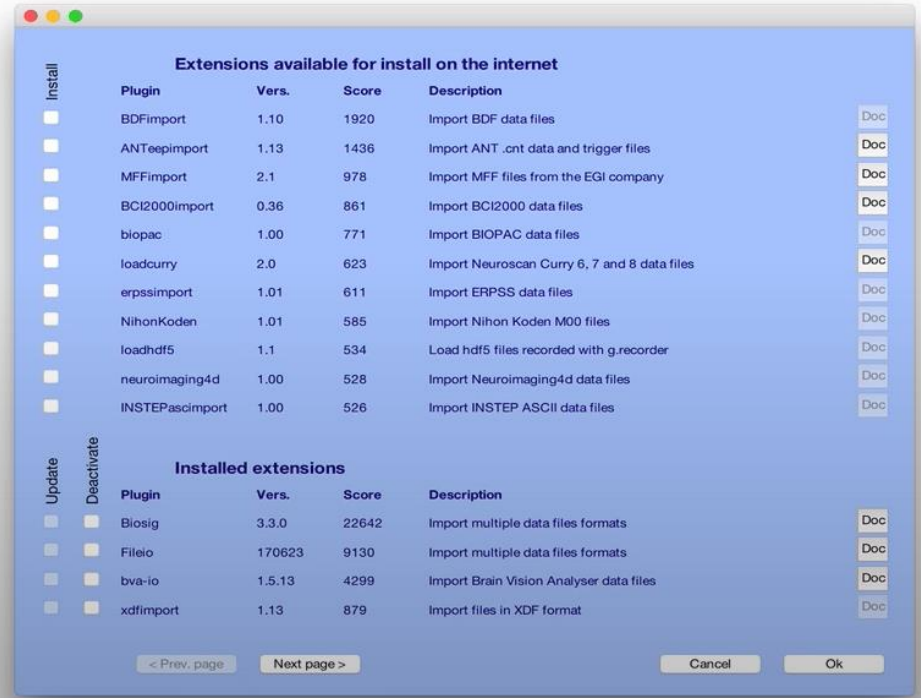
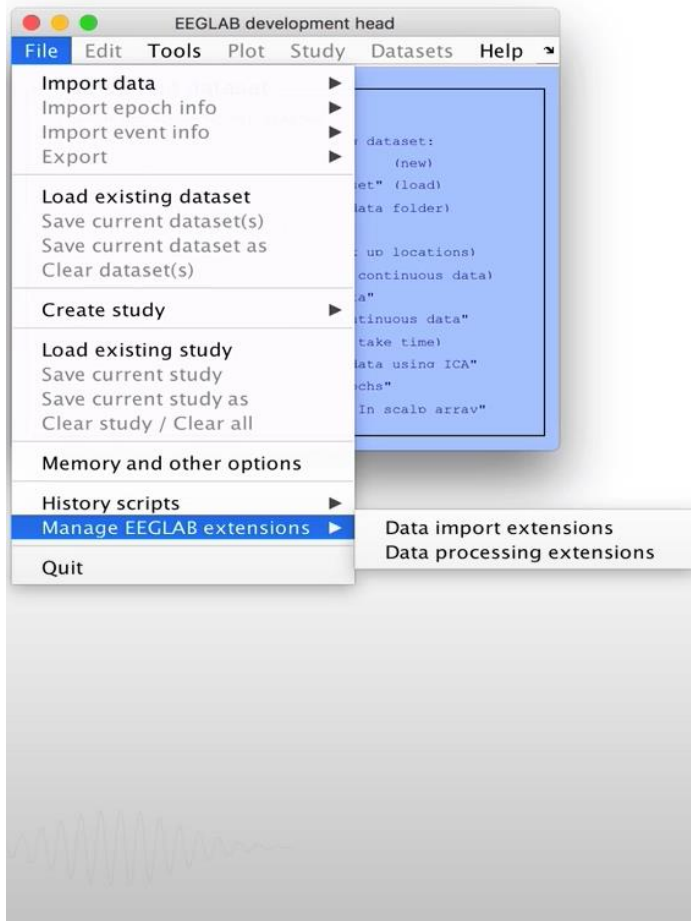
# Starting EEGLAB



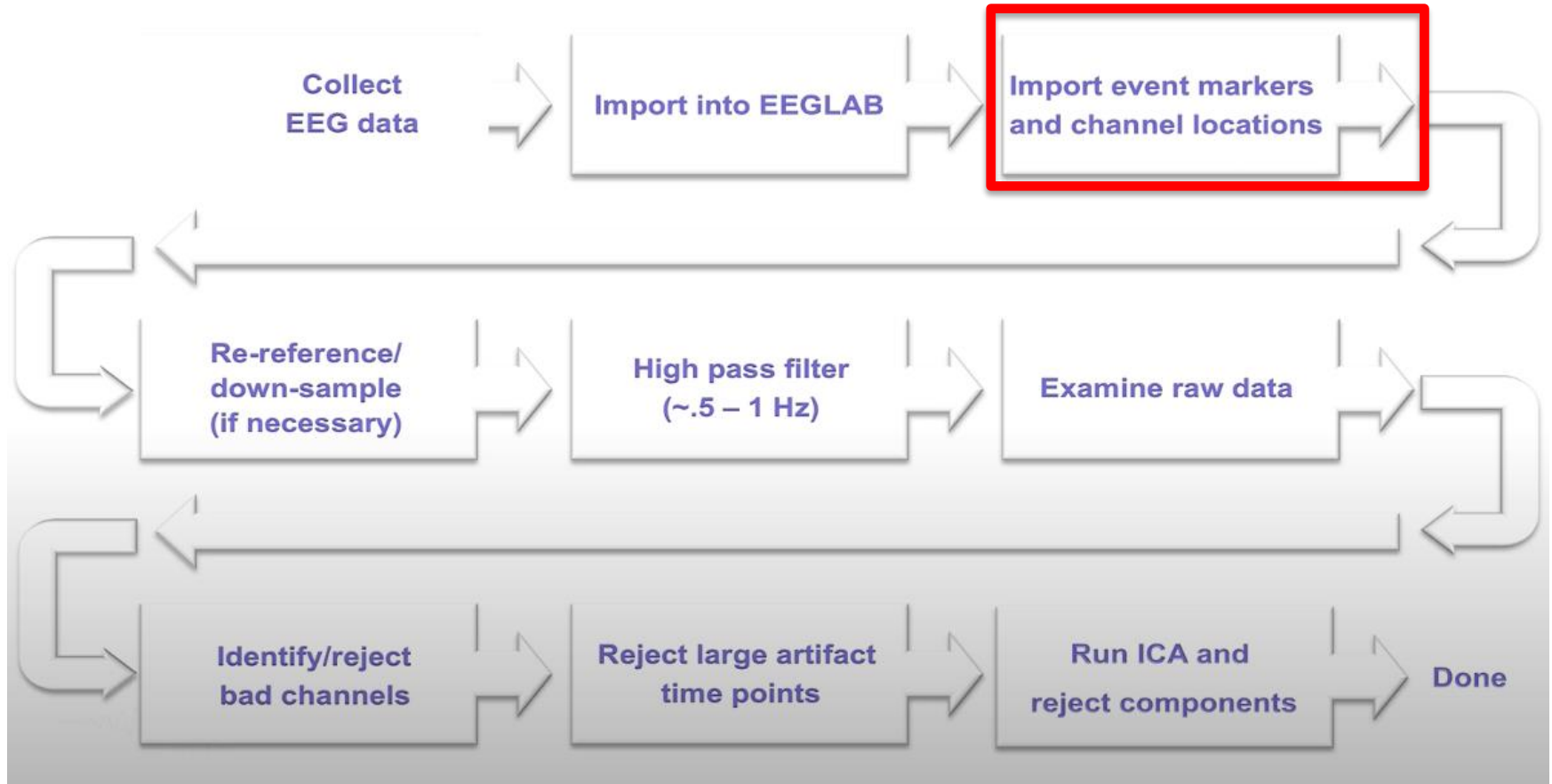
# Loading-in raw EEG data



# Loading-in raw EEG data



# Loading-in raw EEG data





# Import events and channel locations

EEGLAB v2020.0

File Edit Tools Plot Study ERPLAB ERPsets Datasets Help

**#1: Sbj8**

|                    |                  |
|--------------------|------------------|
| Filename:          | none             |
| Channels per frame | 64               |
| Frames per epoch   | 2785180          |
| Epochs             | 1                |
| Events             | 2410             |
| Sampling rate (Hz) | 1000             |
| Epoch start (sec)  | 0.000            |
| Epoch end (sec)    | 2785.179         |
| Reference          | unknown          |
| Channel locations  | No (labels only) |
| ICA weights        | No               |
| Dataset size (Mb)  | 740.2            |

# Import events and channel locations

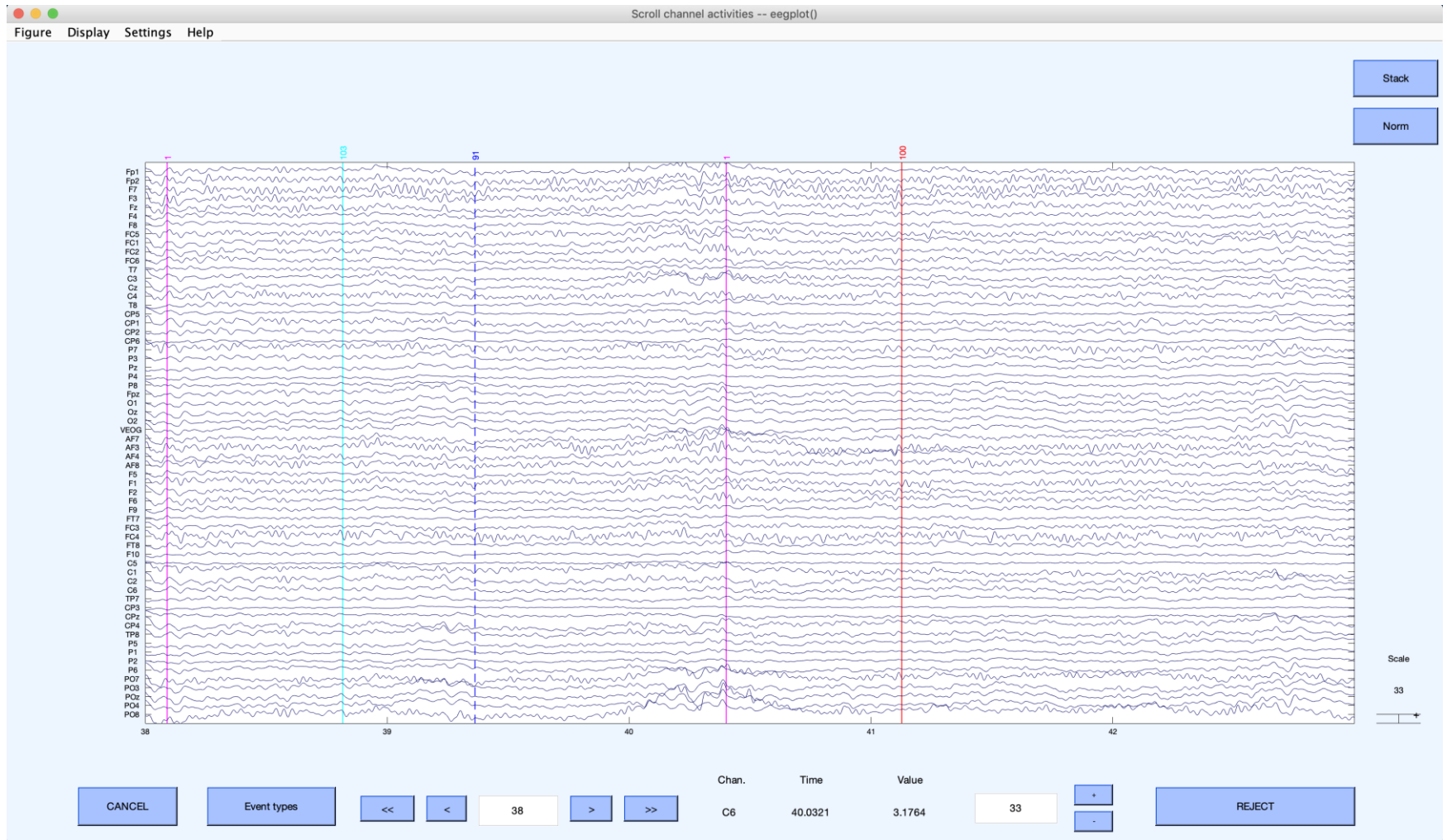


Figure 3

File Edit Tools Pl

- Dataset info
- Event values
- About this data
- Channel locations
- Select data
- Select data using
- Select epochs
- Copy current data
- Append dataset
- Delete dataset

Epochs

Events

**Channel information**

Channel label ("label")

Polar angle ("theta")

Polar radius ("radius")

Cartesian X ("X")

Cartesian Y ("Y")

Cartesian Z ("Z")

Spherical horiz. angle

Spherical azimuth ang

Spherical radius ("sph

Channel type

Reference

Index in backup 'urch

Channel in data array

Delete chan

Insert chan

Plot 2-D

Read locations

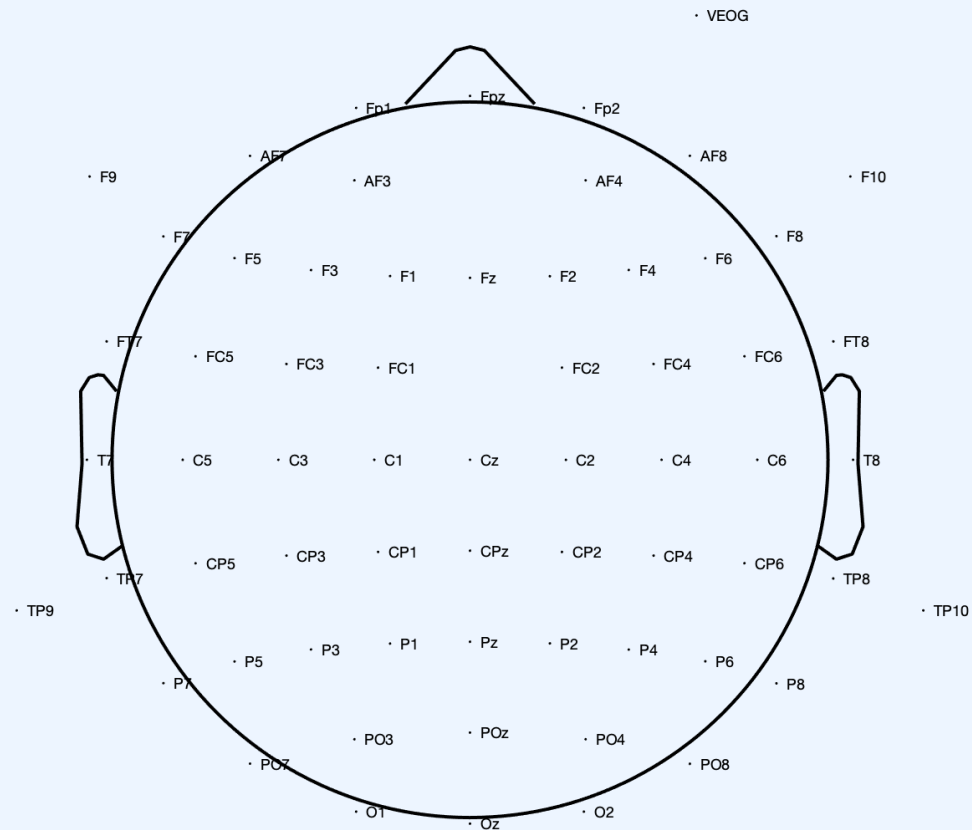
☐ Overwrite Original

Help

File Edit View Insert Tools Desktop Window Help

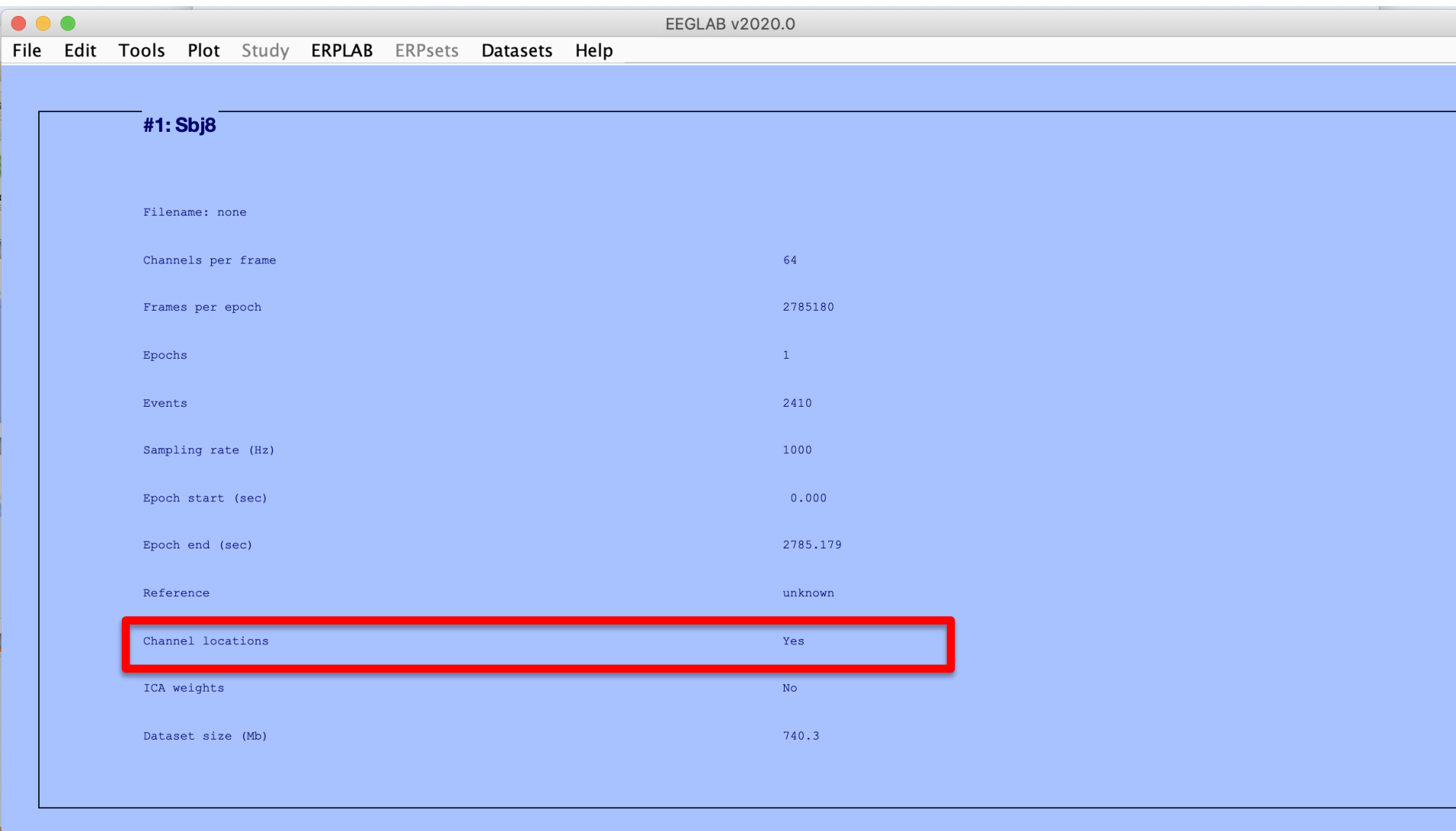


## Channel locations

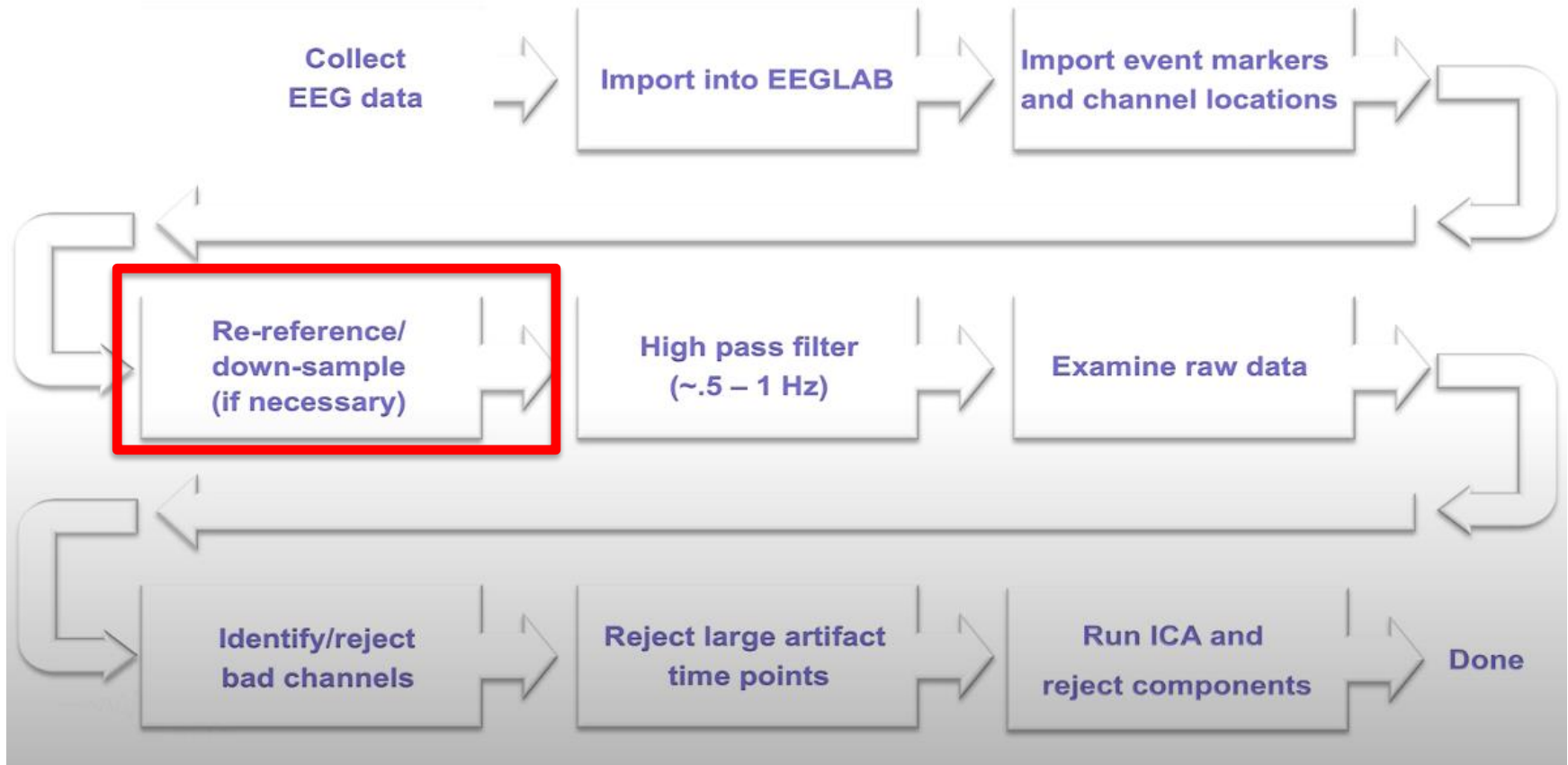


64 of 64 electrode locations shown

# Import events and channel locations



# EEG pre-processing steps



# Re-reference and down-sample



EEGLAB v2020.0

File Edit Tools Plot Study ERPLAB ERPsets Datasets Help

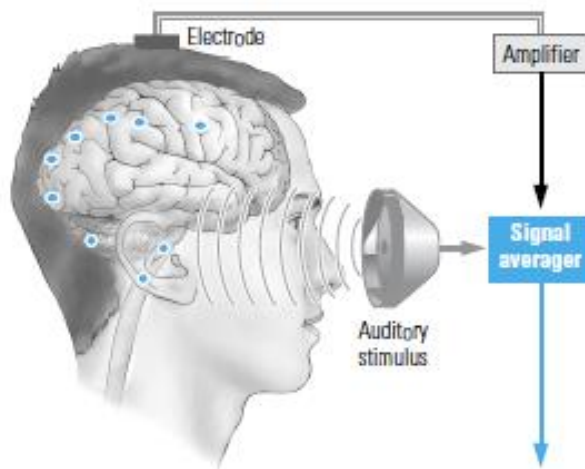
**#1: Sbj8**

|                    |          |
|--------------------|----------|
| Filename:          | none     |
| Channels per frame | 64       |
| Frames per epoch   | 2785180  |
| Epochs             | 1        |
| Events             | 2410     |
| Sampling rate (Hz) | 1000     |
| Epoch start (sec)  | 0.000    |
| Epoch end (sec)    | 2785.179 |
| Reference          | unknown  |
| Channel locations  | Yes      |
| ICA weights        | No       |
| Dataset size (Mb)  | 740.3    |

# (Re-)Referencing

differential amplifier ...

- uses 3 electrodes: active (A), reference (R), ground (G)
- and amplifies then the difference between active and reference site (AG minus RG)
- ambient electrical activity will be the same for AG and RG and will therefore be eliminated by the subtraction
- there is no „voltage“ at a single electrode site

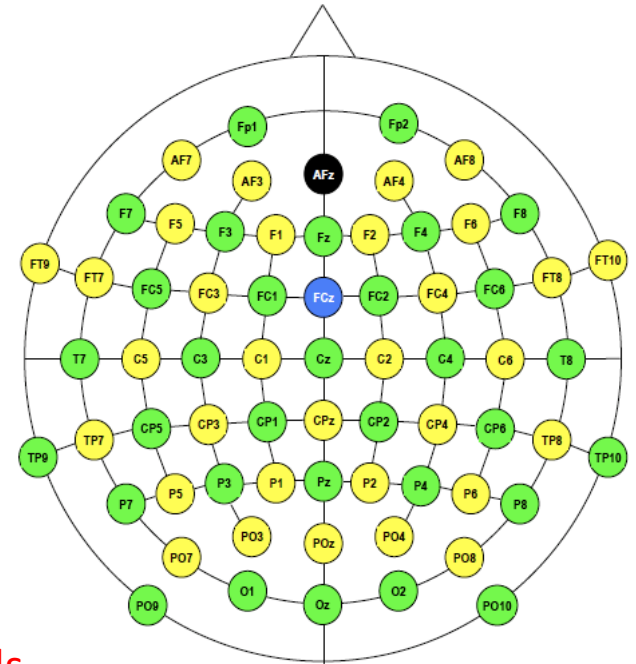


„One of the most important principles is that an ERP waveform reflects the difference in activity between two sites, not the activity at a single site!“

# Choosing a Reference Site

**online reference should be ...**

- as neutral as possible
- convenient and comfortable
- not be biased to one hemisphere

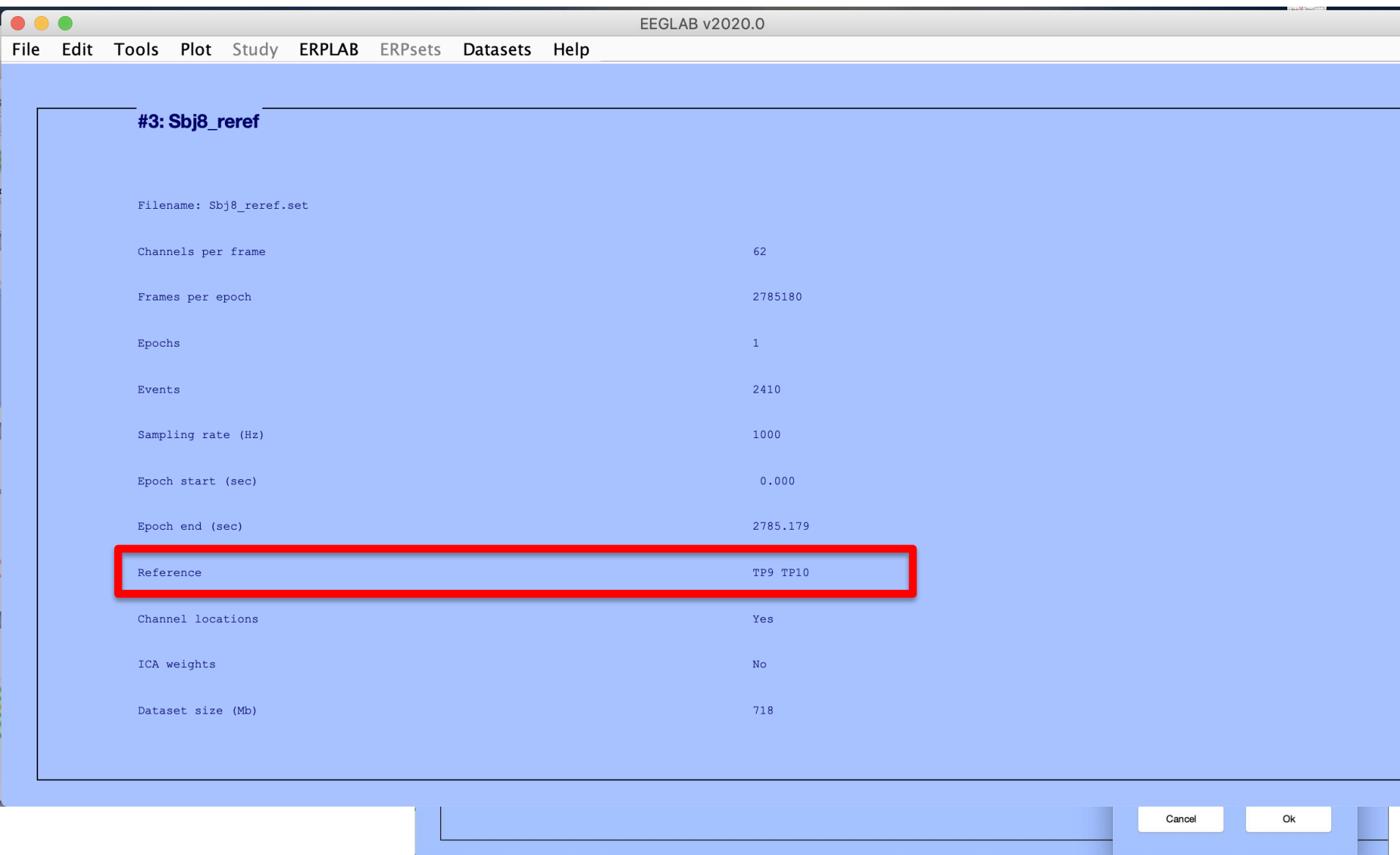


Most common reference: **earlobes & averaged mastoids**

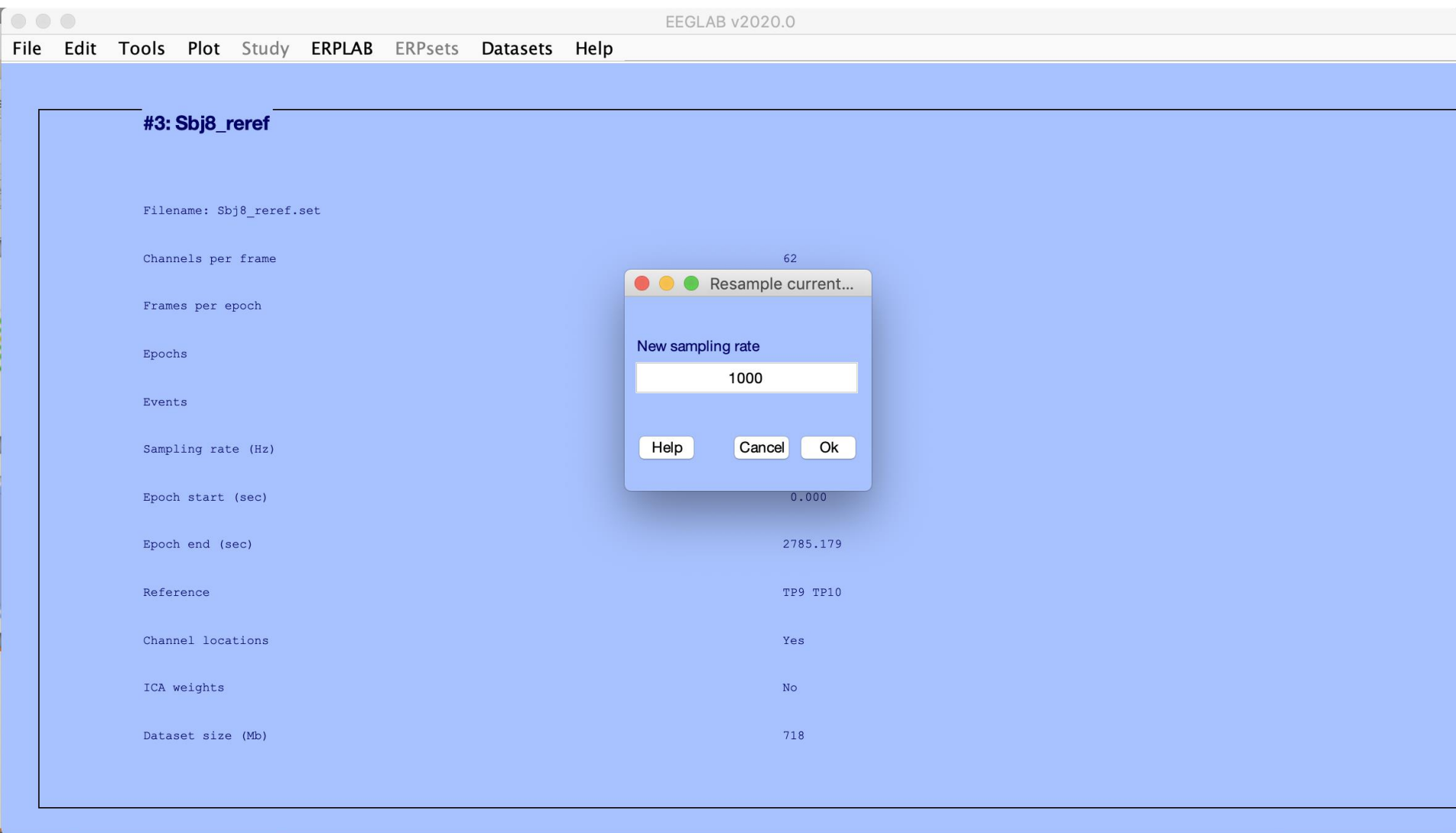
Be careful with common average reference! Might reverse polarity!



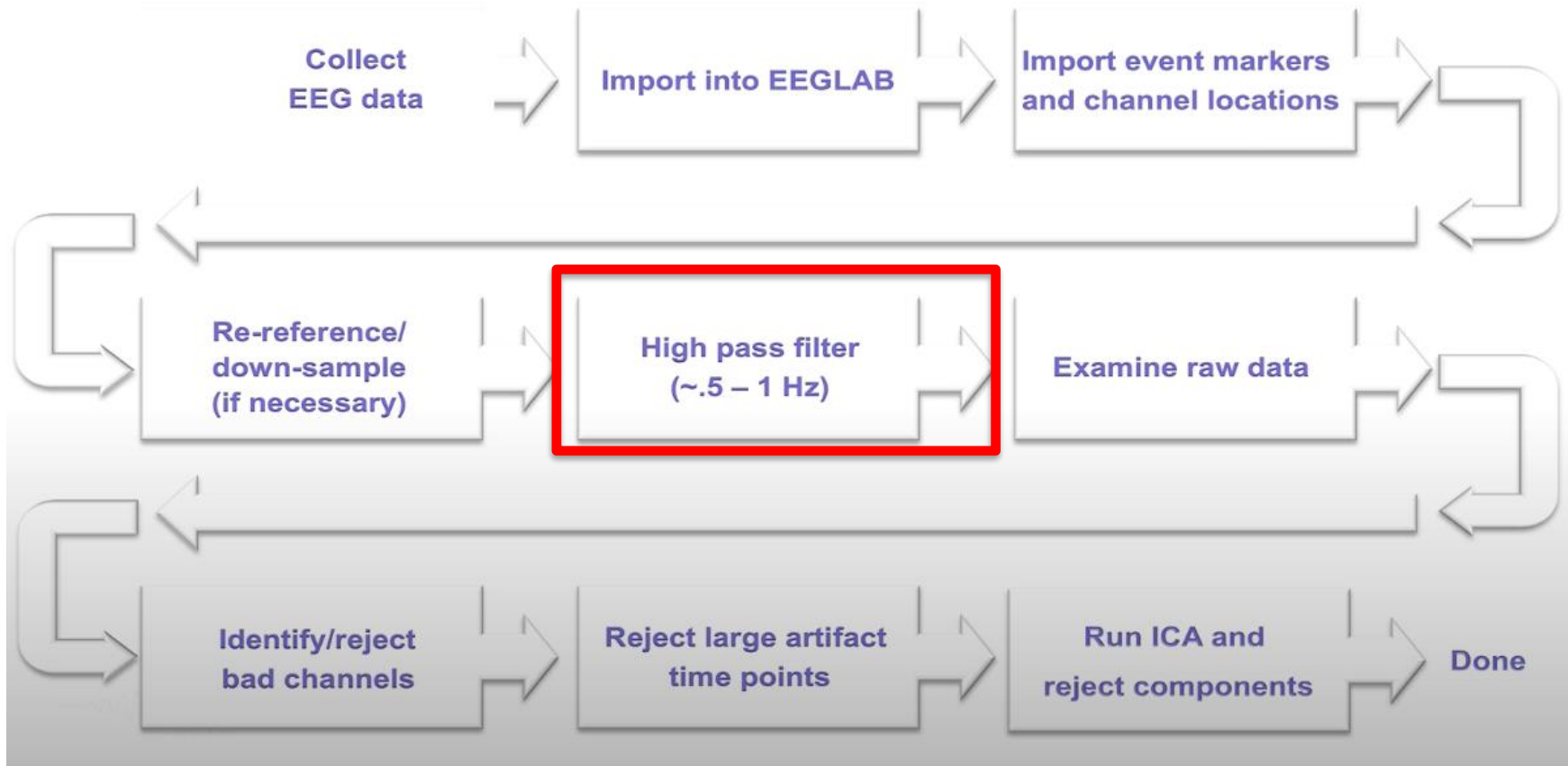
# (Re-)Referencing



# Change sampling rates



# EEG pre-processing steps

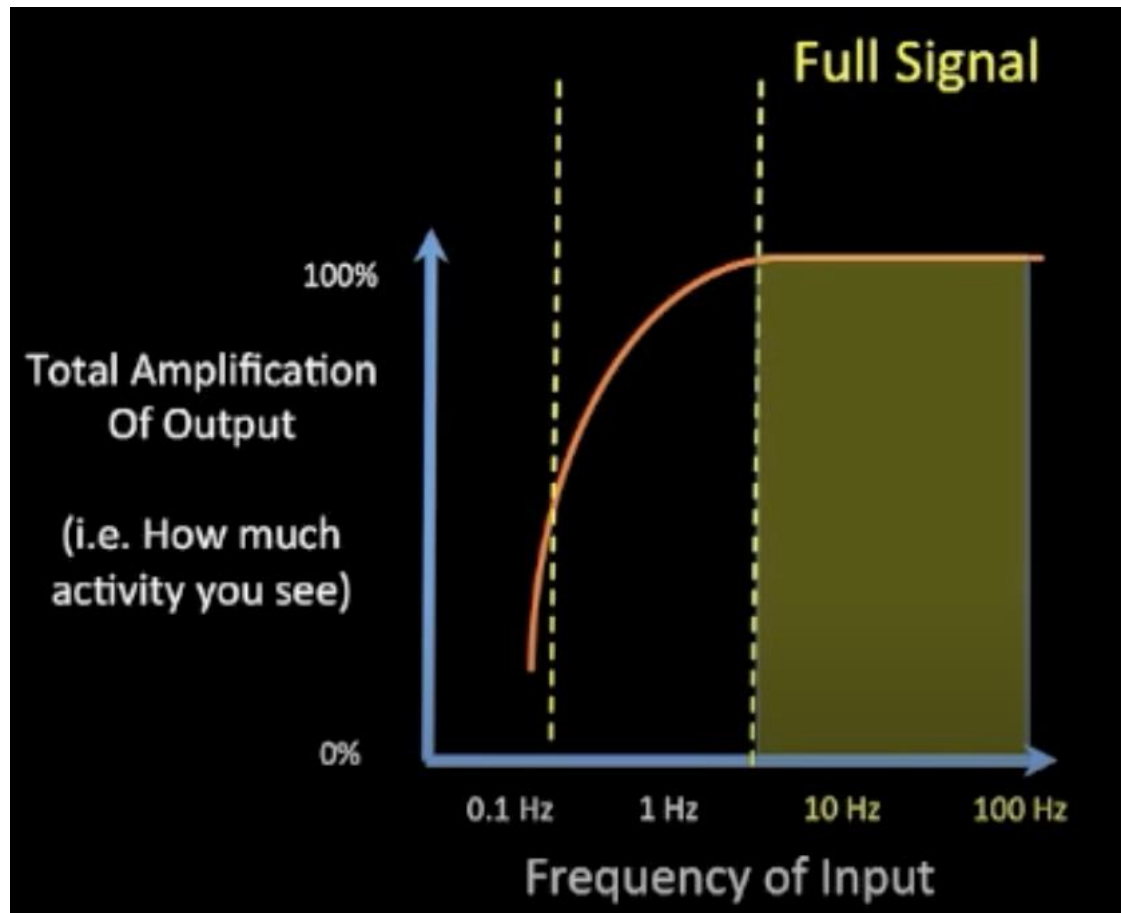


- **4 Most Common Types of Filters:**

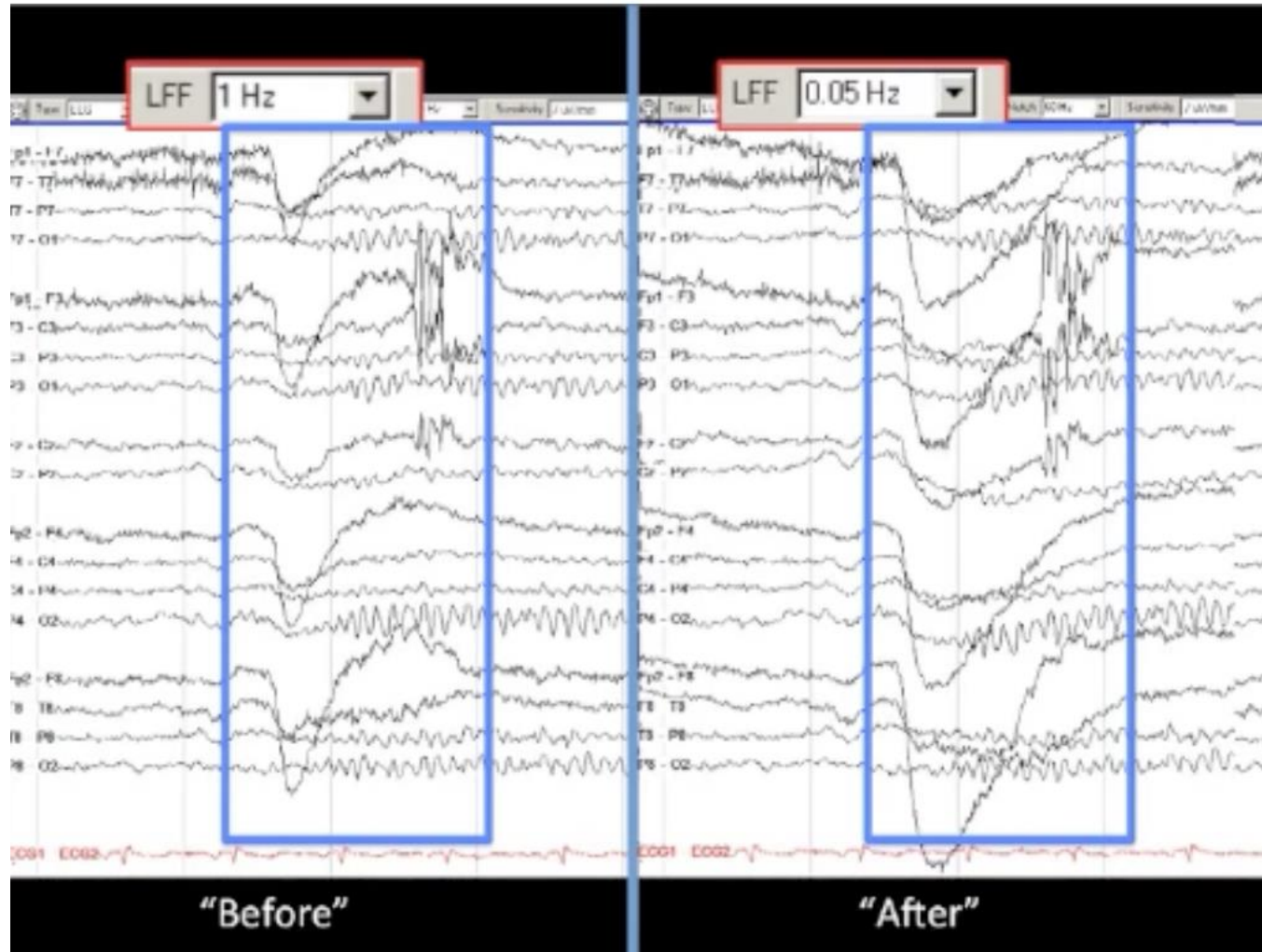
- *High-pass filter (or low-cutoff)*

- - higher frequencies can pass; Filter determines lower cutoff frequency

## *High-pass filter (or low-cutoff)*



## High-pass filter (or low-cutoff)



- **4 Most Common Types of Filters:**

- *High-pass filter (or low-cutoff)*

- - higher frequencies can pass; Filter determines lower cutoff frequency

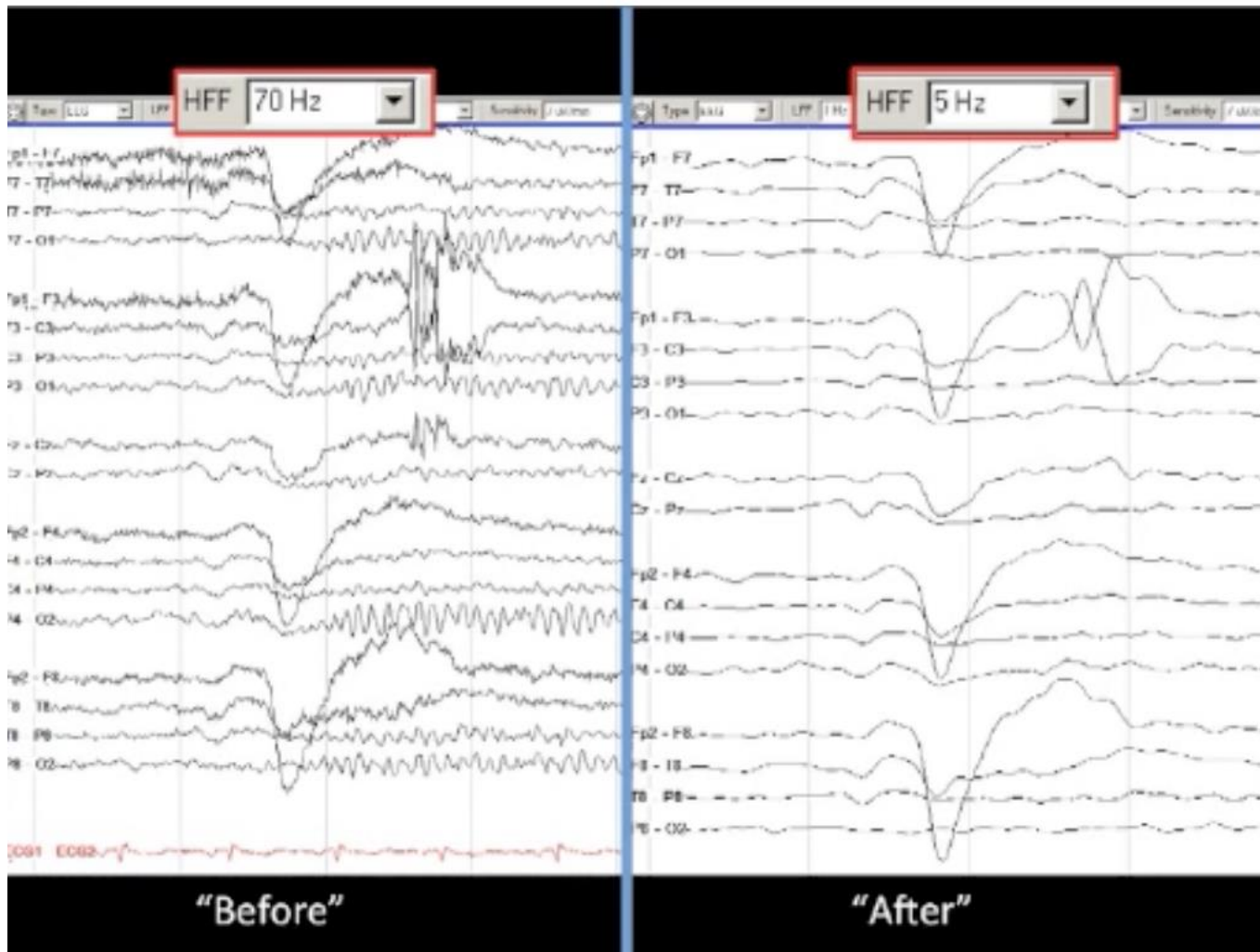
- *Low-pass filter (or high-cutoff)*

- - lower frequencies can pass; Filter determines upper cutoff frequency

- *Bandpass filter*

- - combination of both high- and low-pass filters

# *Low-pass filter (or high-cutoff)*





- **4 Most Common Types of Filters:**

- *High-pass filter (or low-cutoff)*

- - higher frequencies can pass; Filter determines lower cutoff frequency

- *Low-pass filter (or high-cutoff)*

- - lower frequencies can pass; Filter determines upper cutoff frequency

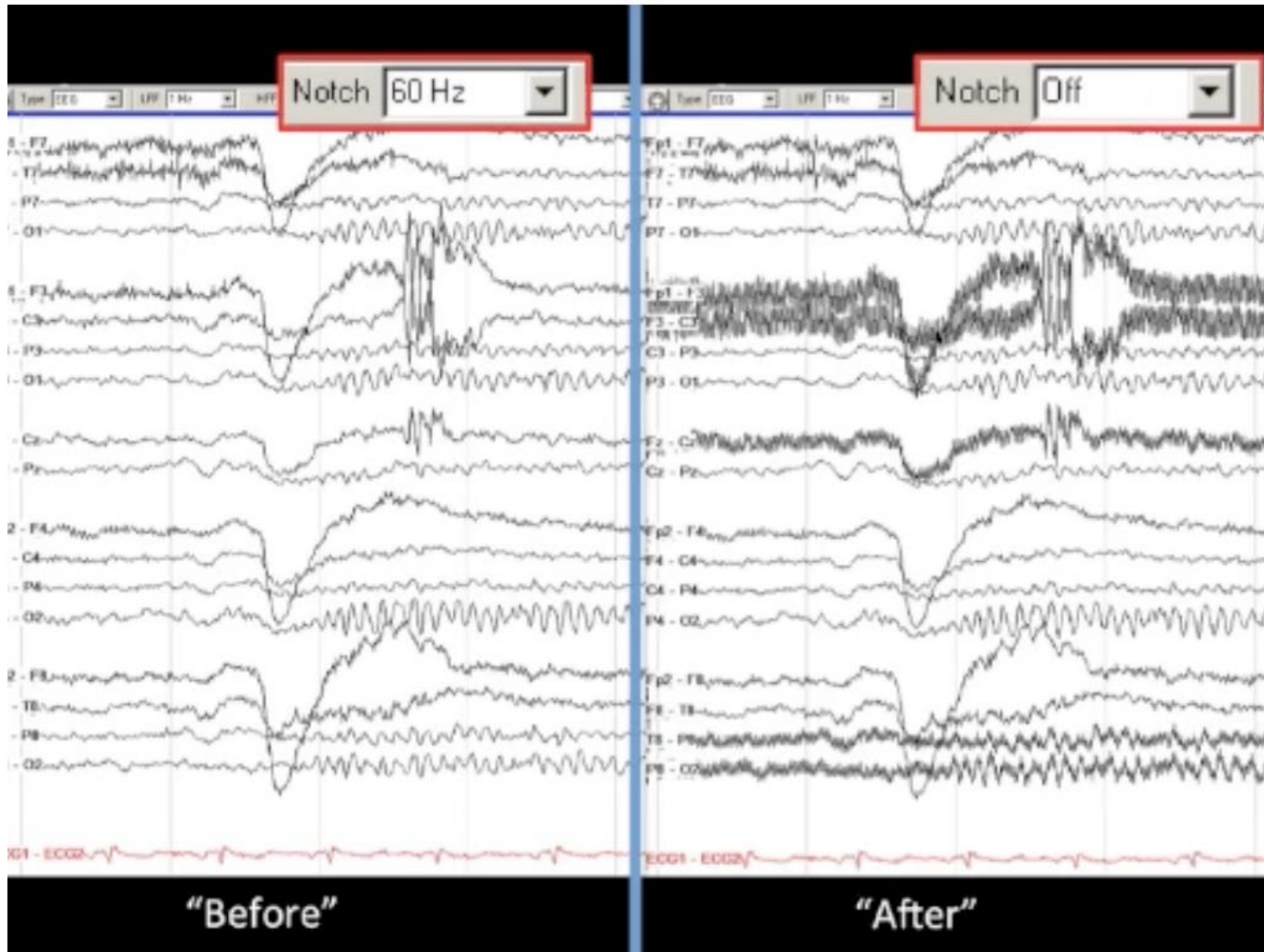
- *Bandpass filter*

- - combination of both high- and low-pass filters

- *Notch filter*

- - attenuates a narrow frequency-band while letting everything else pass

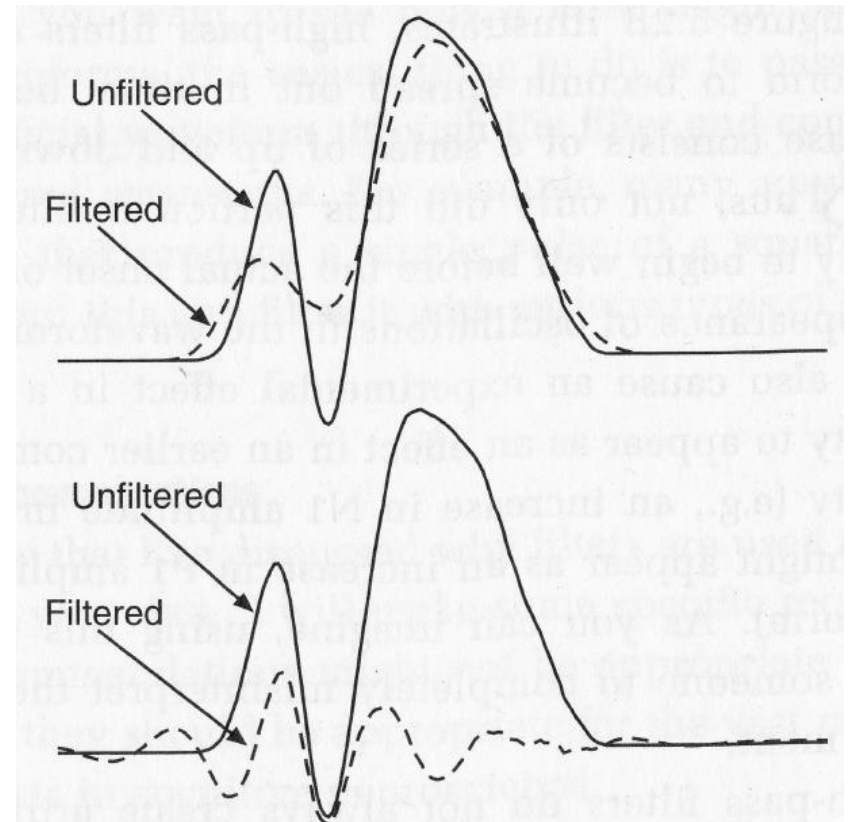
# *Notch filter*



Keep in mind:

## Filtering can severely distort ERPs!!!

- may change the onset and duration of an ERP component
- may make monophasic waveforms appear multiphasic
- may induce artificial oscillations



## Why/When are filters necessary?

1 - if sampling rate is too low (Nyquist Theorem)

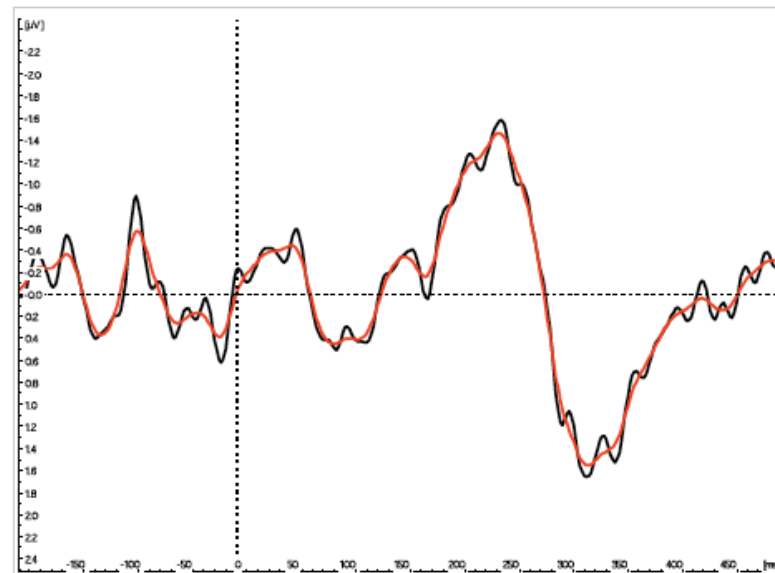
- aliasing, if original signal contains frequencies that are more than twice as high as the digitization rate

2 - to reduce noise

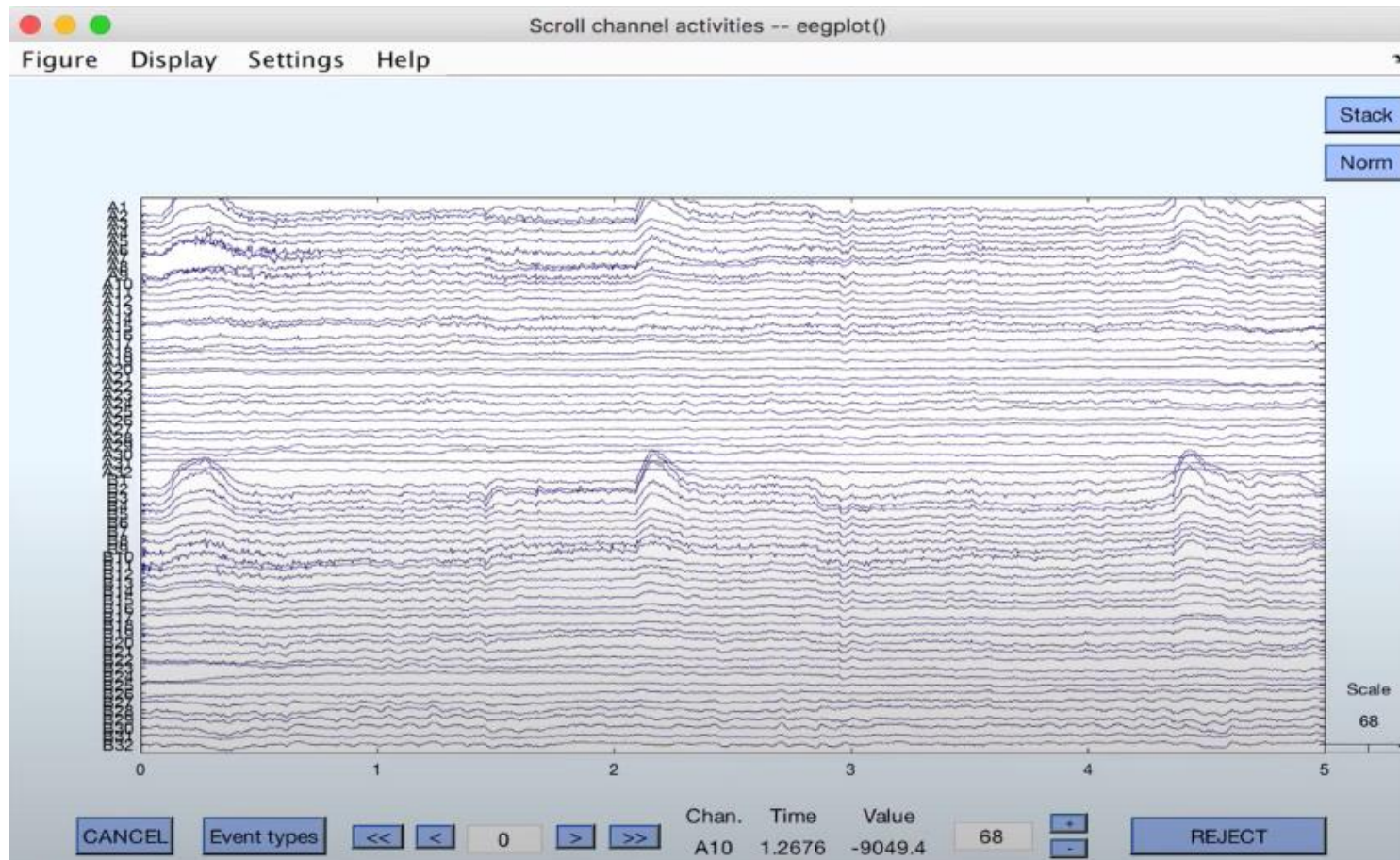
- muscle noise (EMG) >> 100 Hz low pass filter
- slow voltage drifts (sweating) >> 0.1 Hz high pass filter
- (line noise >> 50 Hz notch filter)

3 - to „smooth“ data for visualization

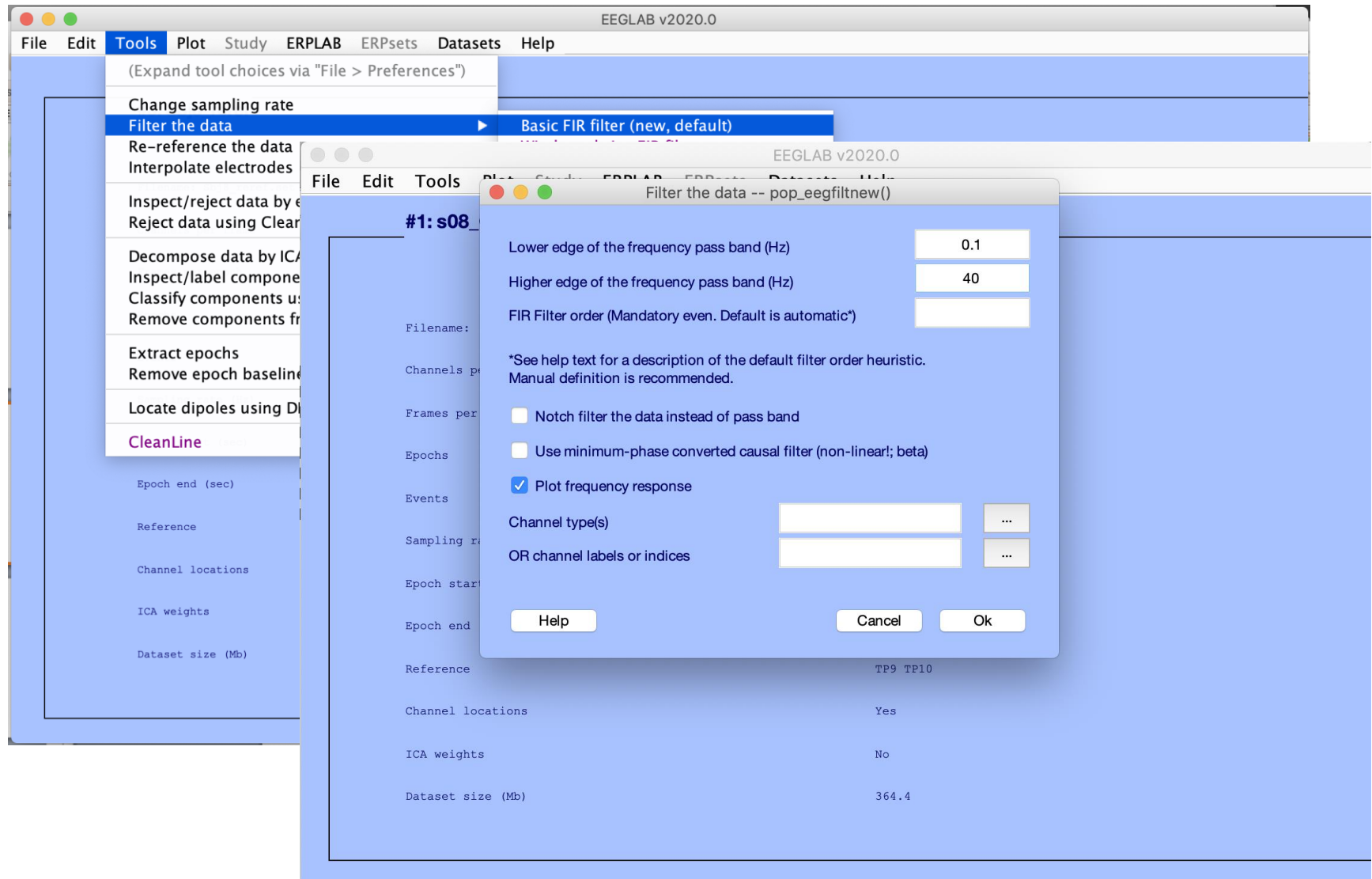
- ERP figures >> 20 Hz low pass filter



## Filtering: remove DC offset



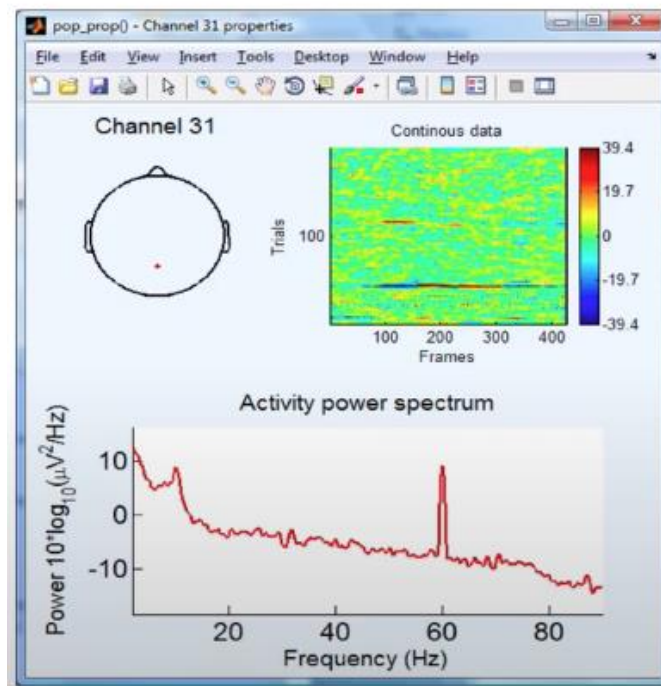
## Filtering: remove slow, possibly large amplitude, drift



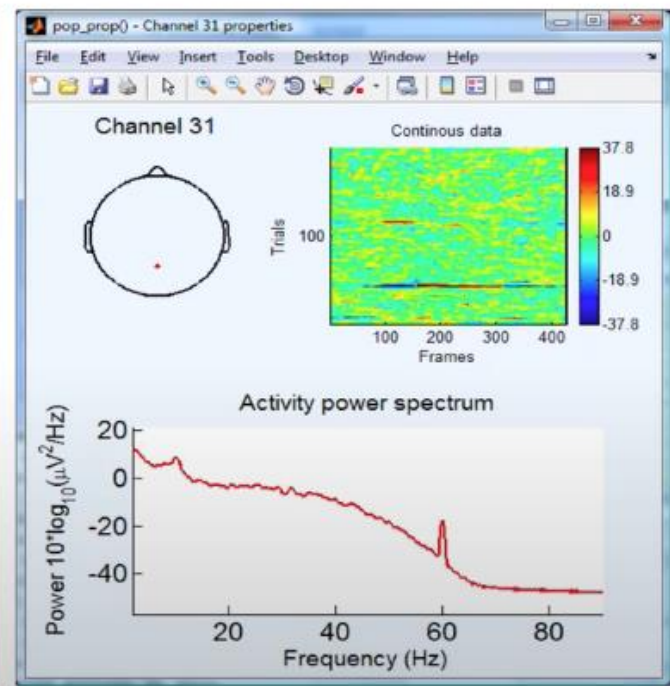


Filtering: remove slow, possibly large amplitude, drift

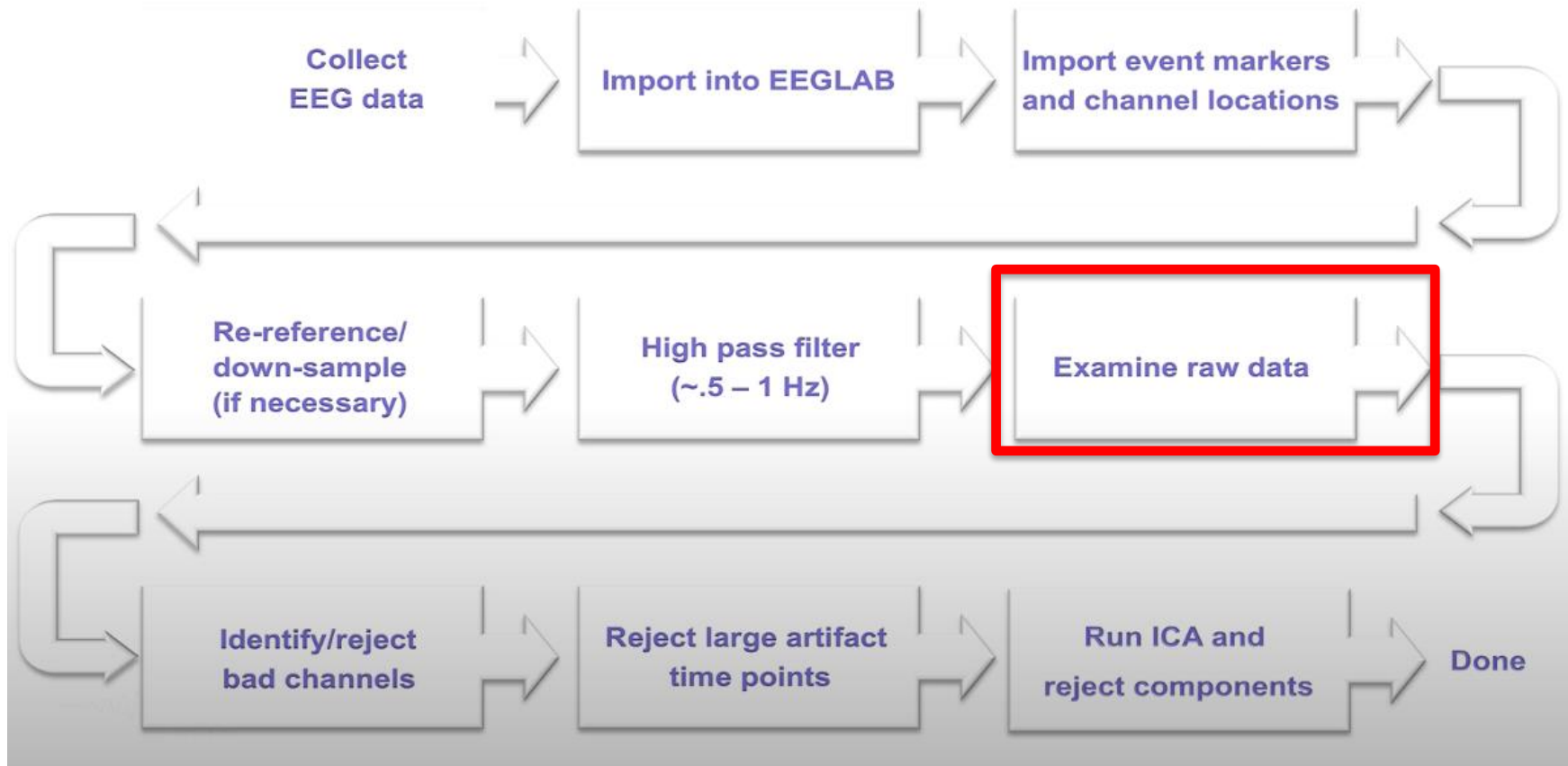
0.5 Hz high-pass filter



0.5 Hz high-pass filter  
50 Hz low-pass filter

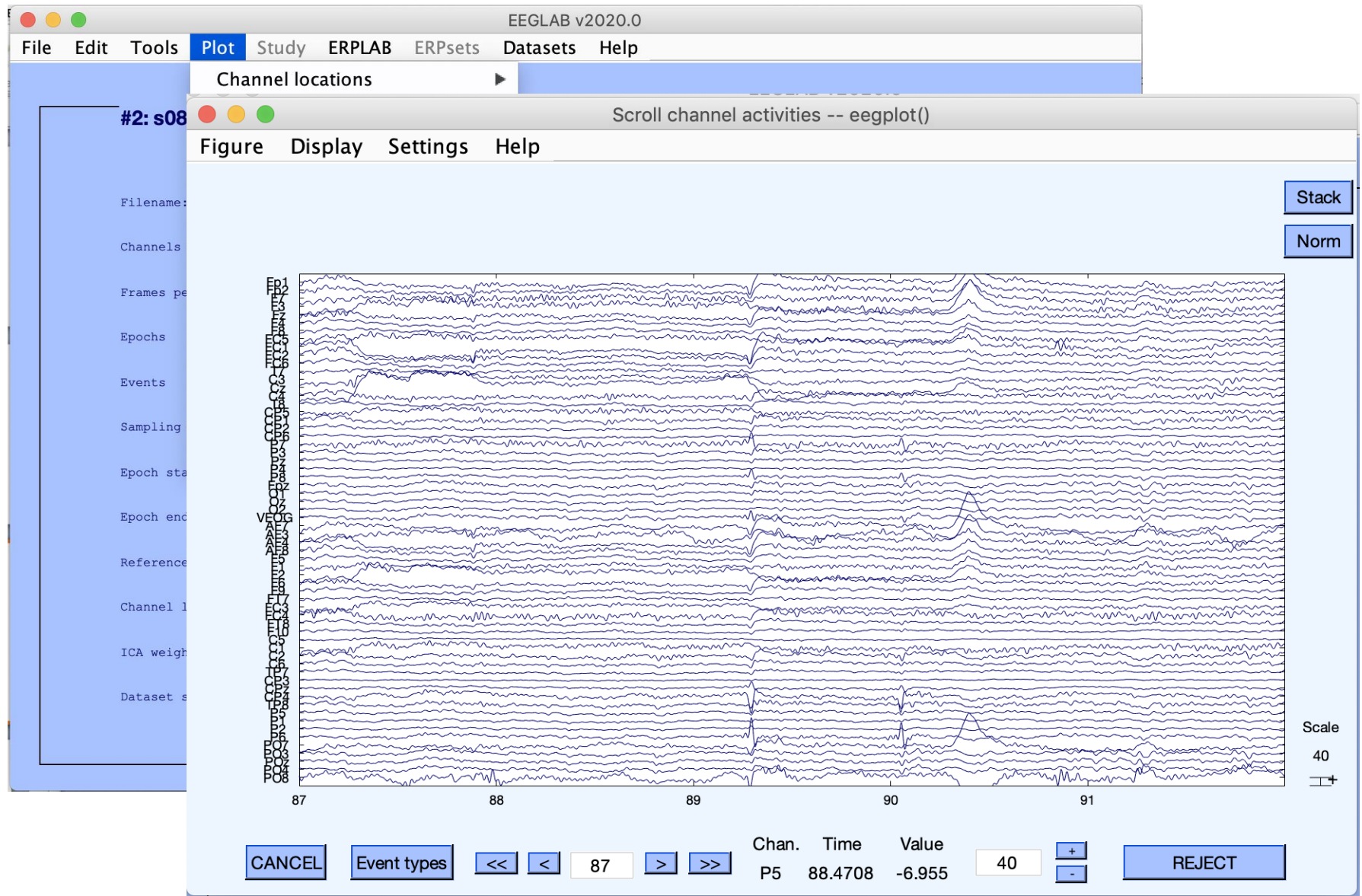


# EEG pre-processing steps

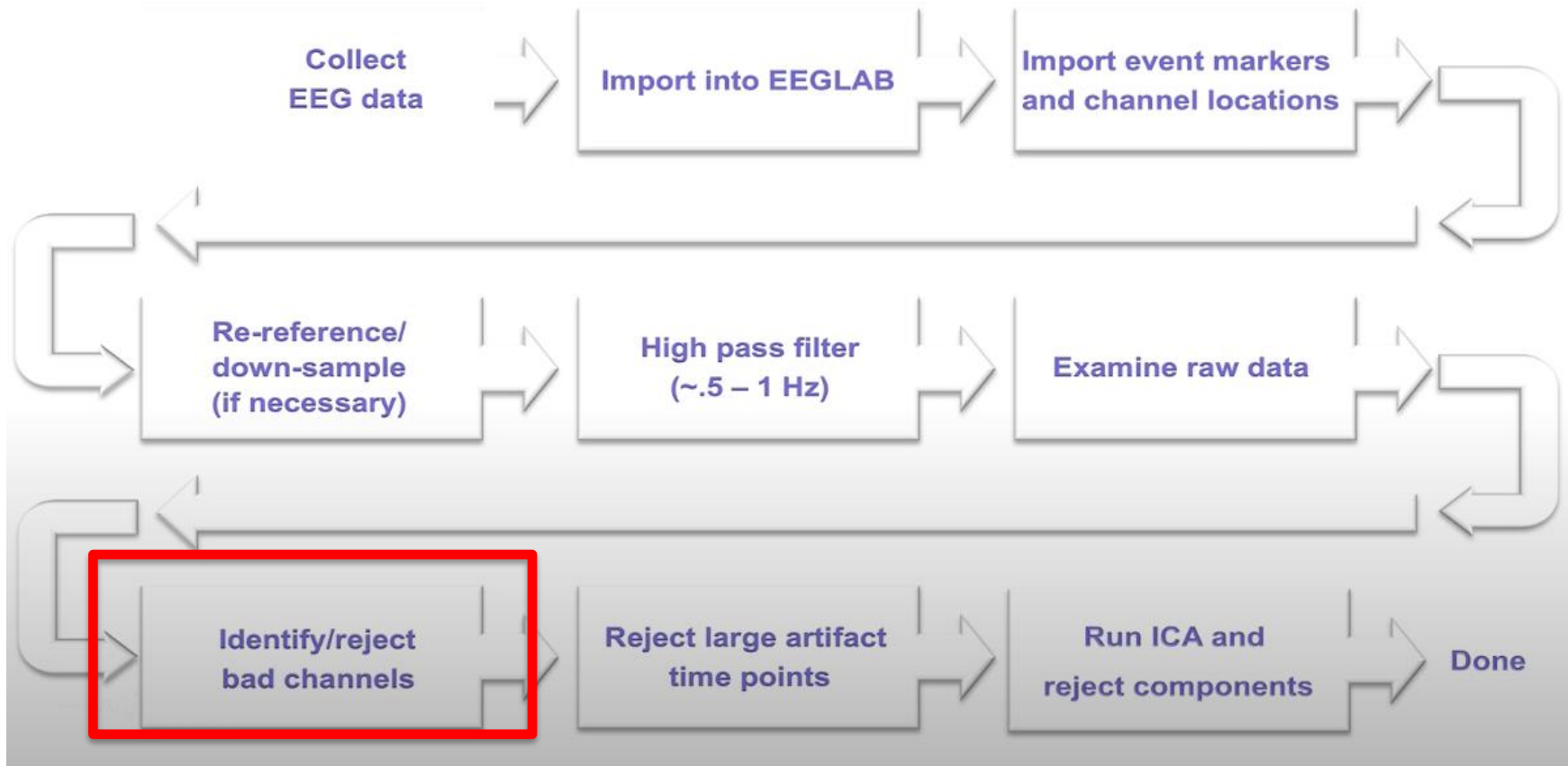




# Examine raw data



# EEG pre-processing steps



# Identify/ reject bad channels

The screenshot displays the EEGLAB v2020.0 software interface. The main window shows a list of datasets on the left and a detailed view of the selected dataset, '#1: s08\_CC\_reref\_resampled\_01\_40...'. The 'Edit' menu is open, showing options like 'Dataset info', 'Event values', 'About this dataset', 'Channel locations', 'Select data', 'Select data using events', 'Select epochs or events', 'Copy current dataset', 'Append datasets', and 'Delete dataset(s) from memory'. The 'Select data' dialog box is open, allowing users to select data ranges. The dialog box has a table with columns 'Select data in:', 'Input desired range', and 'on->remove these'. The 'Channel range' is currently set to 'CP1 CP2 CP6'. A 'Scroll dataset' button is also present. On the right side of the dialog box, there is a list of channels (1 - Fp1, 2 - Fp2, 3 - F7, 4 - F3, 5 - Fz, 6 - F4, 7 - F8, 8 - FC5, 9 - FC1, 10 - FC2, 11 - FC6, 12 - T7, 13 - C3, 14 - Cz, 15 - C4, 16 - T8, 17 - CP5, 18 - CP1, 19 - CP2, 20 - CP6) and 'Cancel' and 'Ok' buttons.

EEGLAB v2020.0

File Edit Tools Plot Study ERPLAB ERPsets Datasets Help

Dataset info  
Event values  
About this dataset  
Channel locations  
**Select data**  
Select data using events  
Select epochs or events  
Copy current dataset  
Append datasets  
Delete dataset(s) from memory

Epochs  
Events  
Sampling rate (Hz)  
Epoch start (sec)  
Epoch end (sec)  
Reference  
Channel locations  
ICA weights  
Dataset size (Mb)

#1: s08\_CC\_reref\_resampled\_01\_40...

Filename: ...ned with ICA\_elist\_bins.set

Channels per frame

Frames per epoch

Epochs

Events

Sampling rate (Hz)

Epoch start (sec)

Epoch end (sec)

Reference

Channel locations

ICA weights

Dataset size (Mb)

TP9 TP10

Yes

Yes

1379.8

Select data -- pop\_select()

Select data in: Input desired range on->remove these

Time range [min max] (s)

Point range (ex: [1 10])

Epoch range (ex: 3:2:10)

Channel range

CP1 CP2 CP6

Scroll dataset

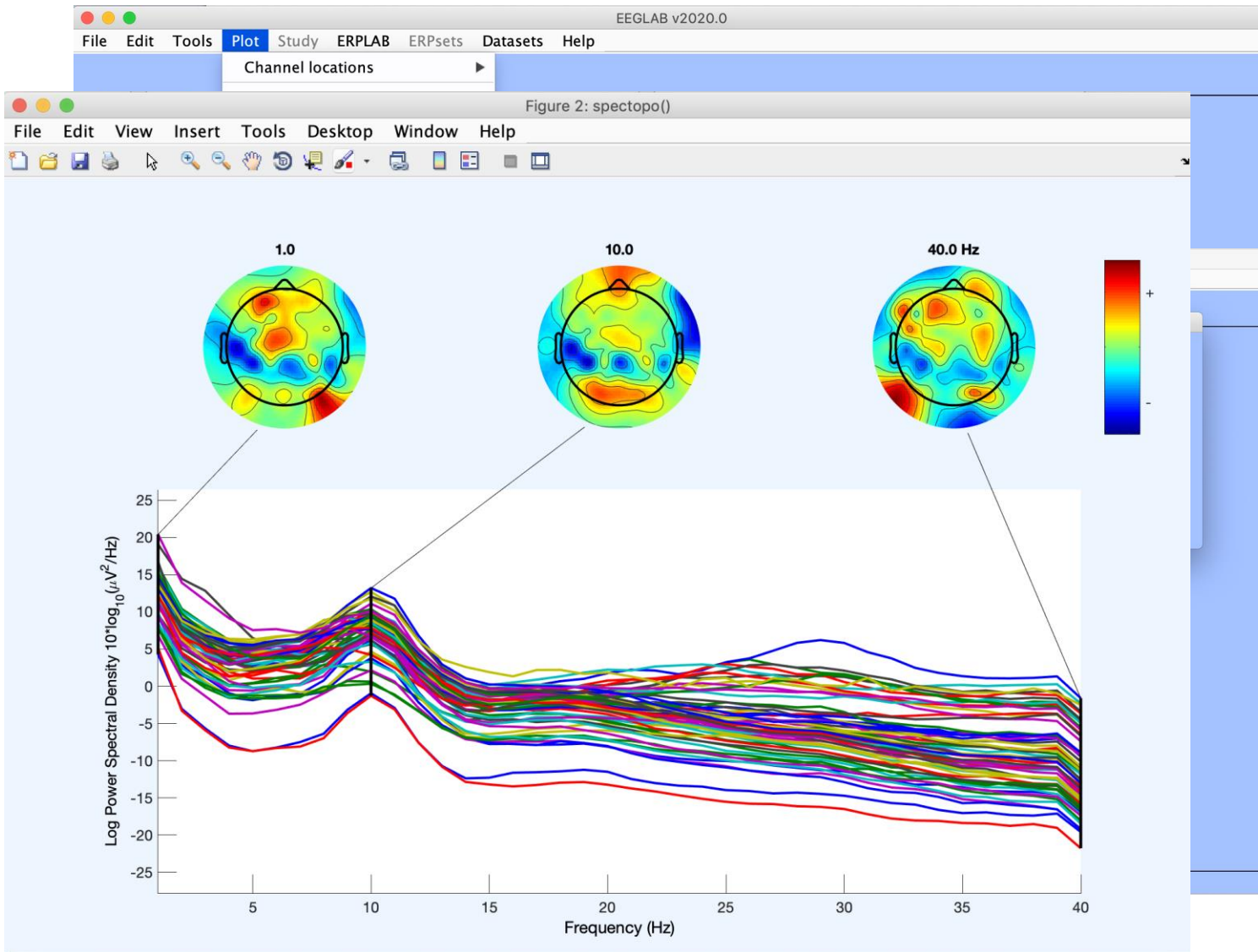
Help Cancel Ok

(use shift|ctrl to select several)

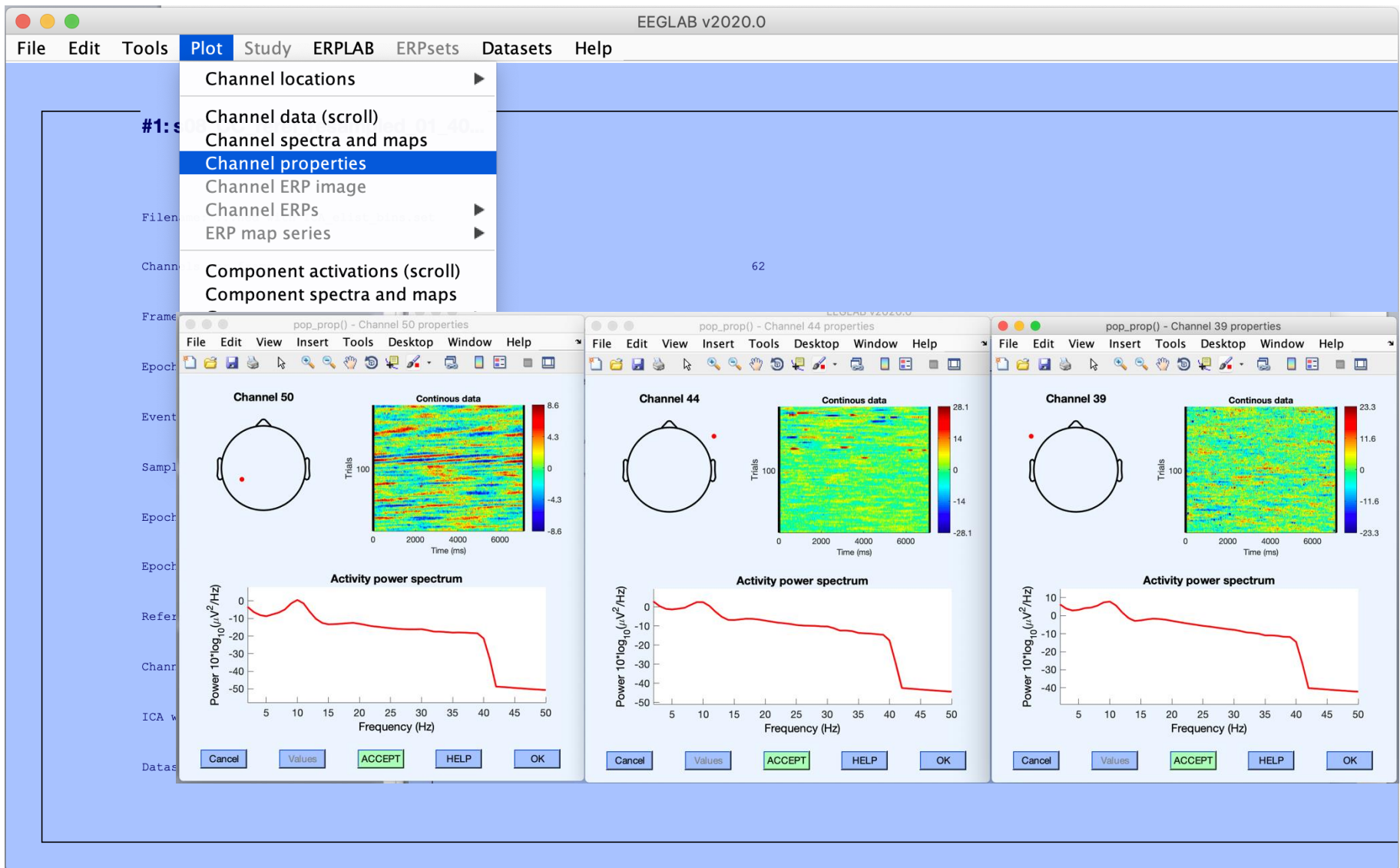
1 - Fp1  
2 - Fp2  
3 - F7  
4 - F3  
5 - Fz  
6 - F4  
7 - F8  
8 - FC5  
9 - FC1  
10 - FC2  
11 - FC6  
12 - T7  
13 - C3  
14 - Cz  
15 - C4  
16 - T8  
17 - CP5  
18 - CP1  
19 - CP2  
20 - CP6

Cancel Ok

# Identify/ reject bad channels

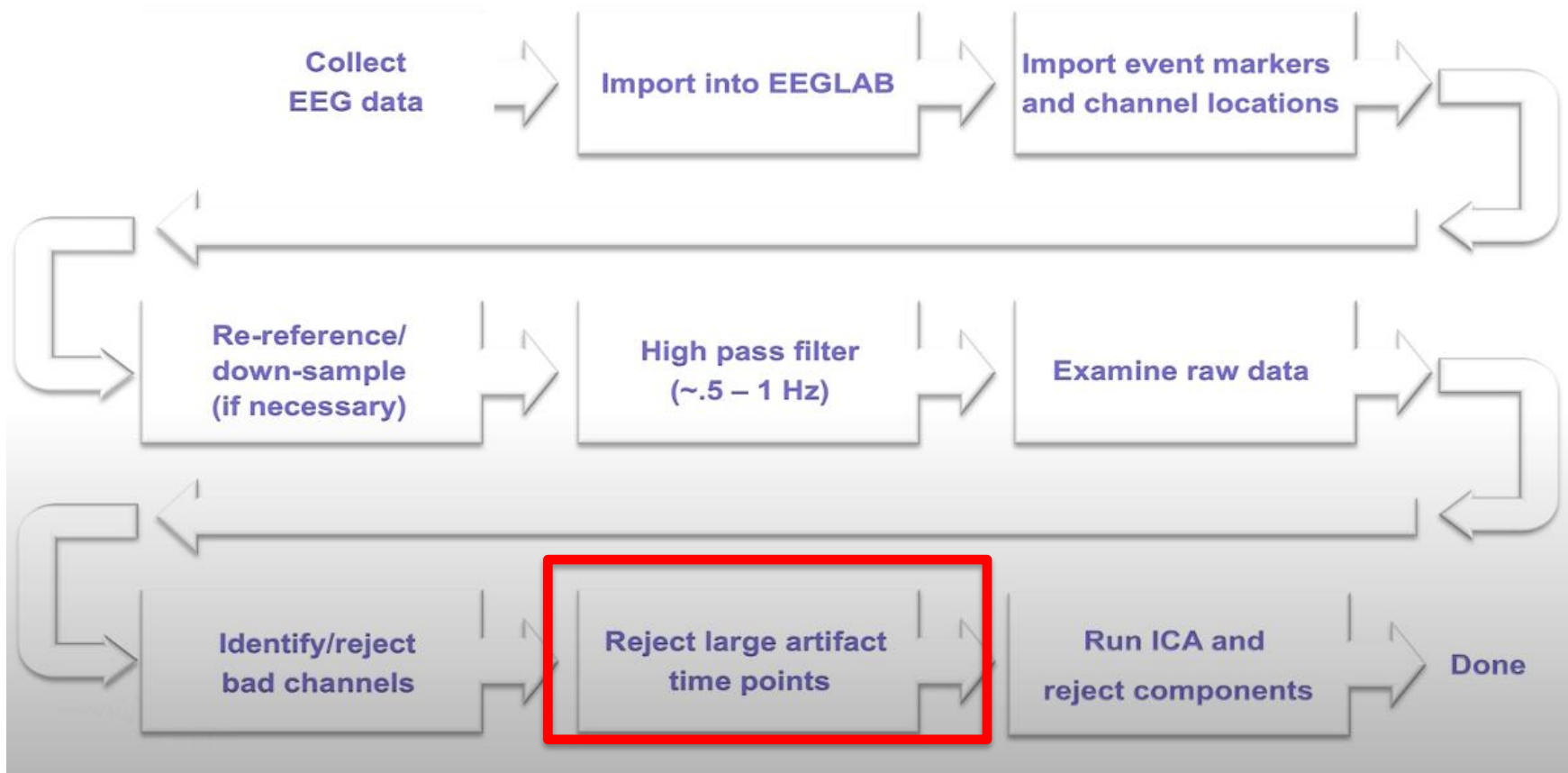


# Identify/ reject bad channels

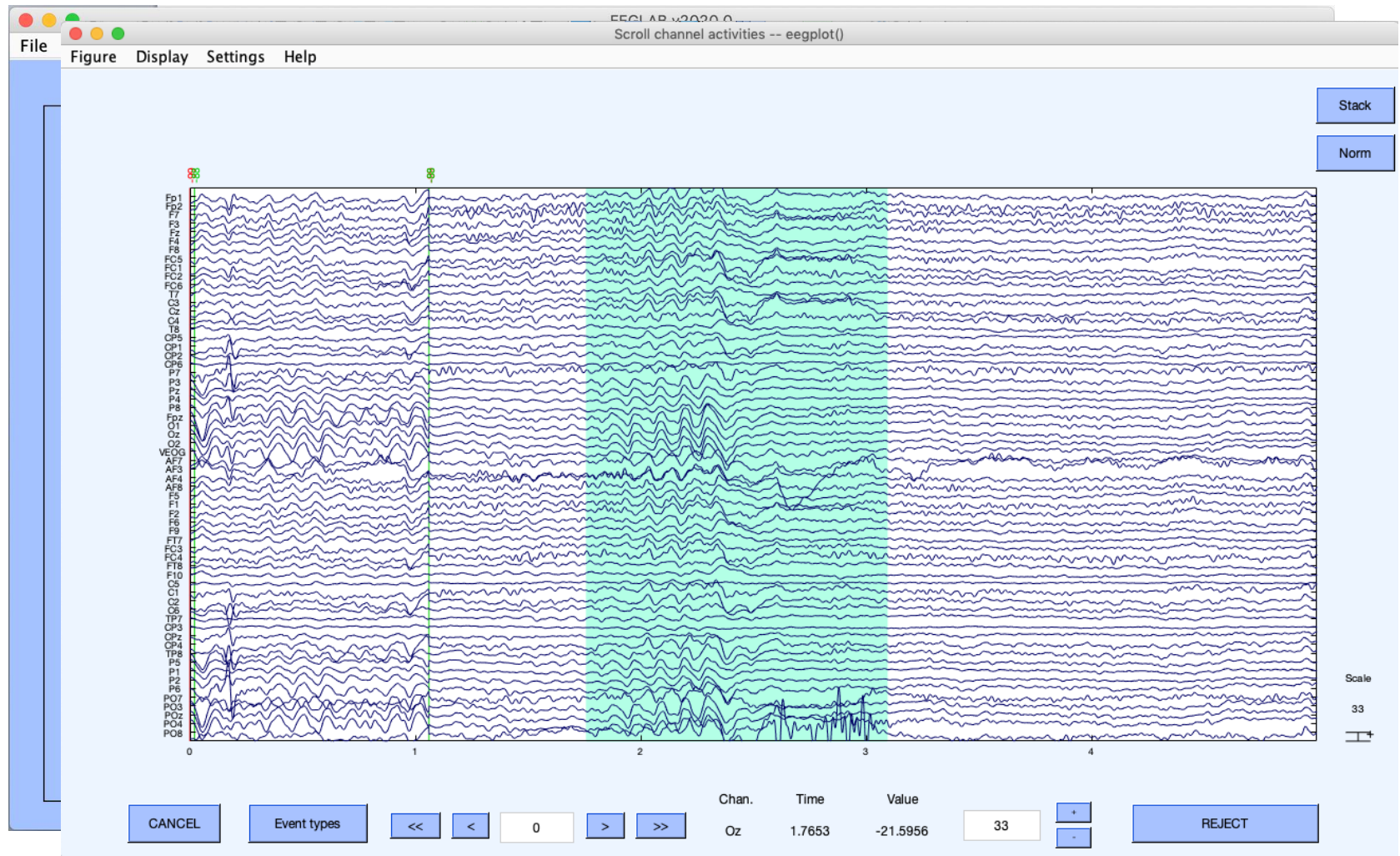




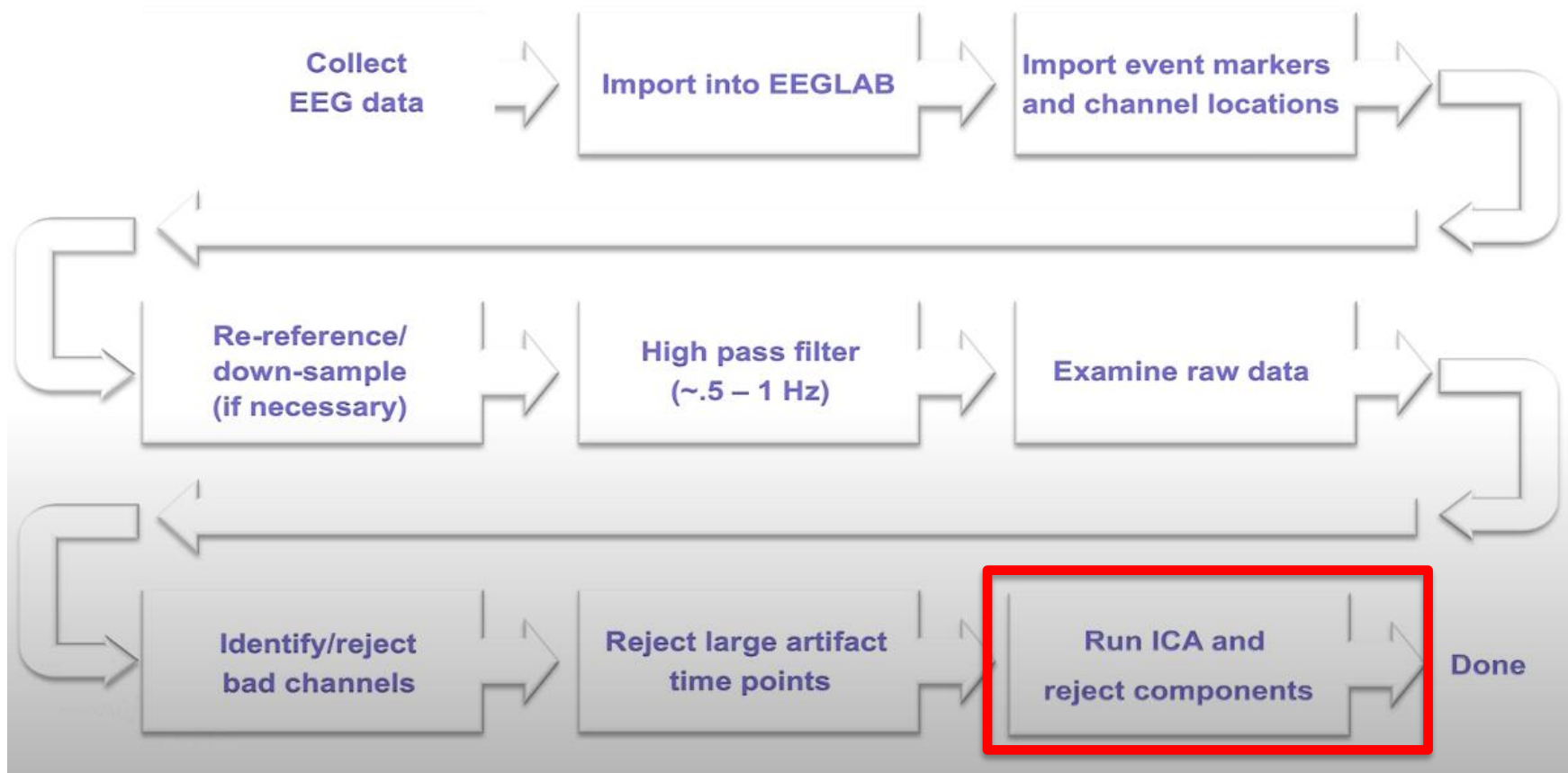
# EEG pre-processing steps



## Removing bad data segments



# EEG pre-processing steps

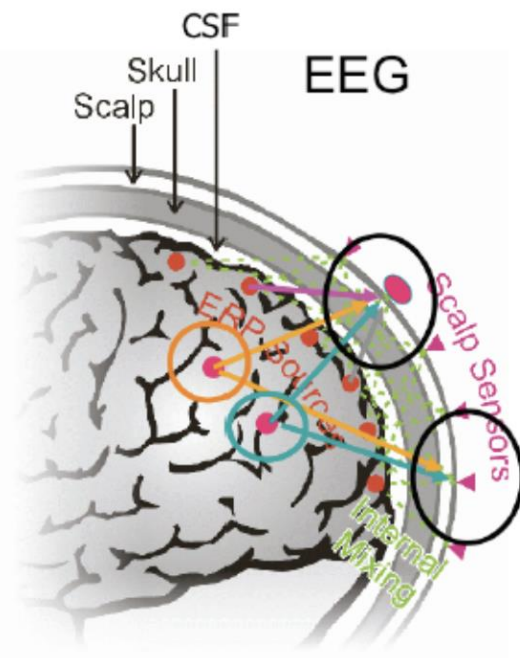




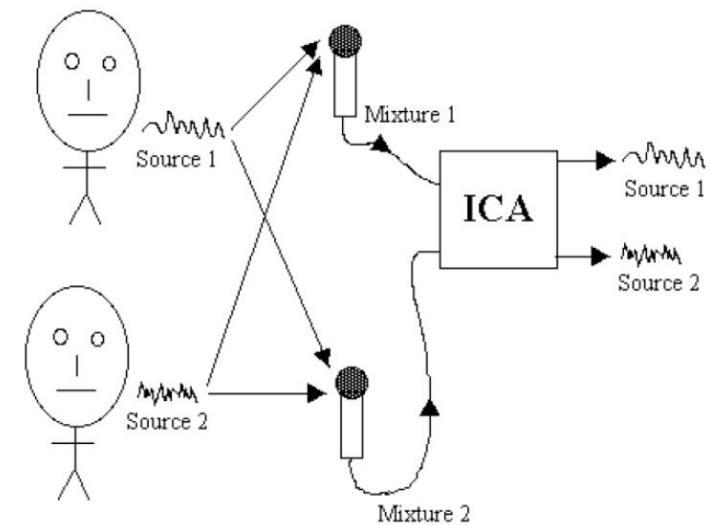
# Independent Component Analysis (ICA)

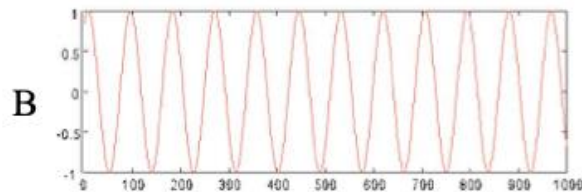
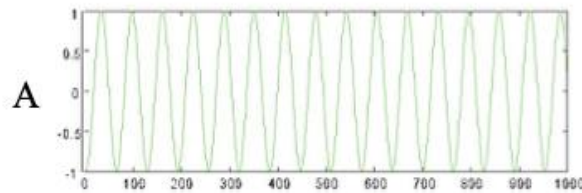
- „blind source separation“
- tries to decompose EEG signals into maximally independent components
- purely statistical method!
- results strongly depend on data quality

## EEG decomposition using ICA



### Cocktail Party

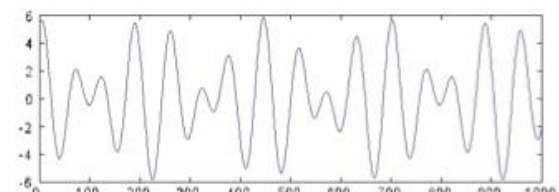
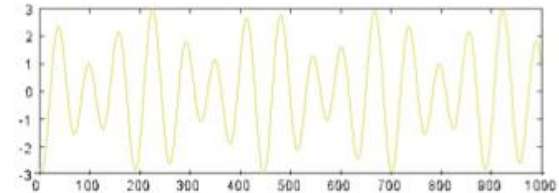
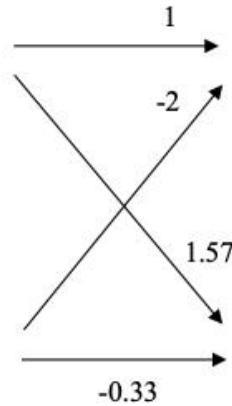




$$Y=[A;B]$$

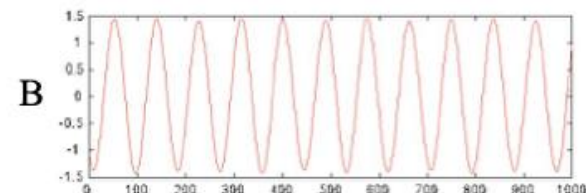
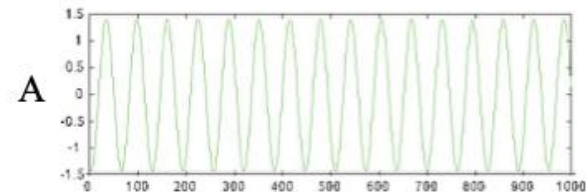
**Linear Combination**

$$X=YW$$



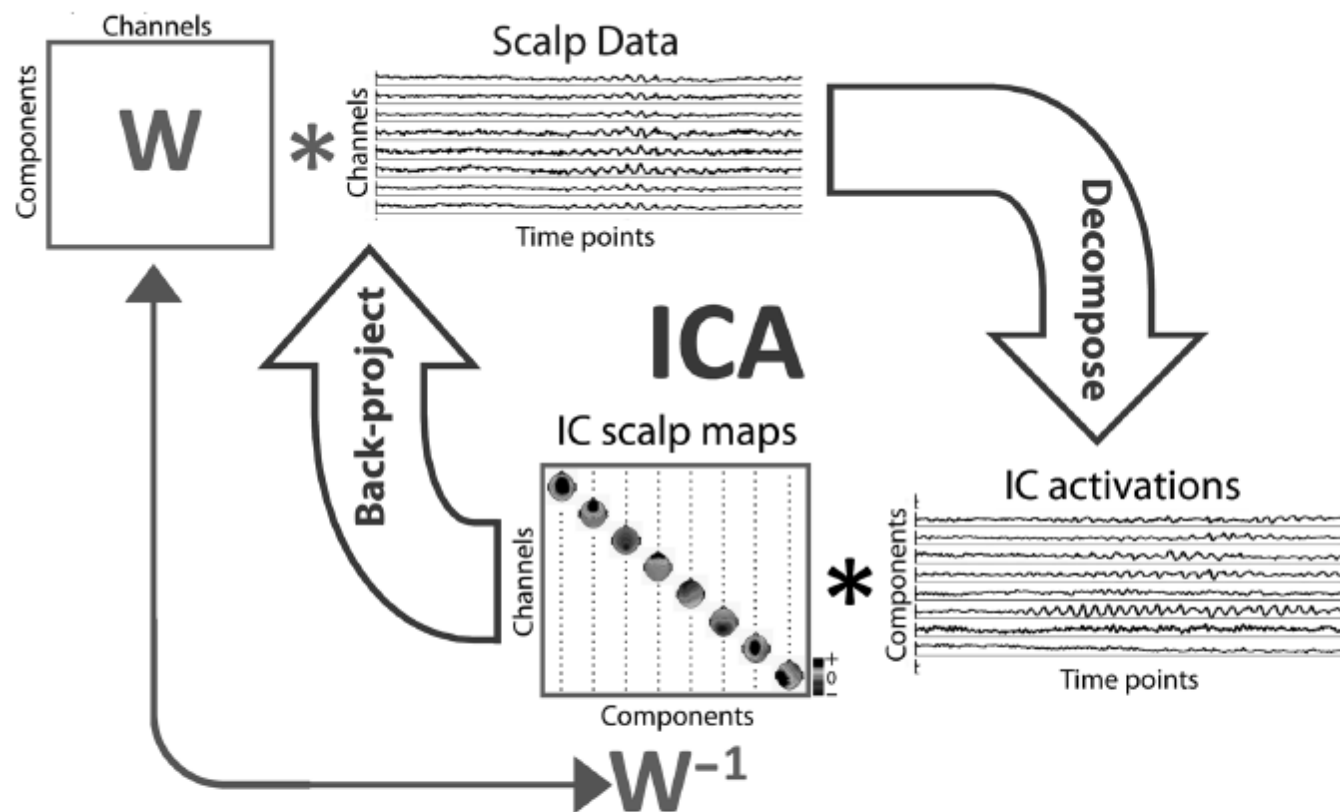
**ICA**

$$\tilde{Y}=W^{-1}\tilde{X}$$



ICA is a method to recover a version,  
of the original sources by multiplying  
the data by a unmixing matrix

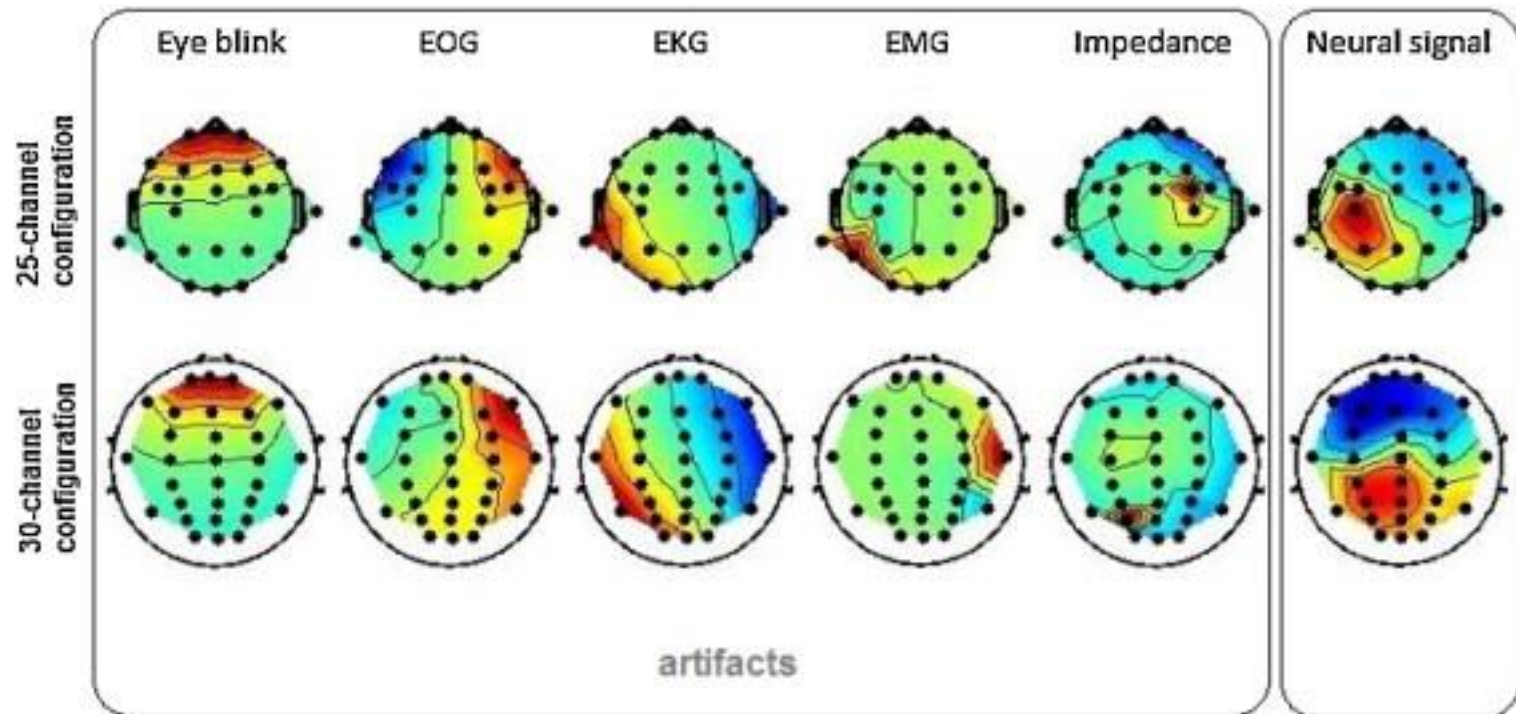




**Figure S6.2**

Flow diagram of ICA. The scalp EEG/EOG data are passed through a neural network to obtain the unmixing matrix,  $W$ . If the unmixing matrix is multiplied by the EEG/EOG data at each time point (the scalp data), this yields the activation of each of the independent components (ICs) at each time point (the IC activations). The mixing matrix,  $W^{-1}$ , is the inverse of the unmixing matrix, and it represents the scalp distribution of each IC. If we multiply the IC activations by the mixing matrix, we recover the original scalp data. Reprinted with permission from Makeig and Onton (2012). Copyright 2012 Oxford University Press.

## EEG decomposition using ICA



[https://arnauddelorme.com/ica\\_for\\_dummies/](https://arnauddelorme.com/ica_for_dummies/)

<https://www.sciencedirect.com/science/article/pii/S0165027015000370>

## EEG decomposition using ICA

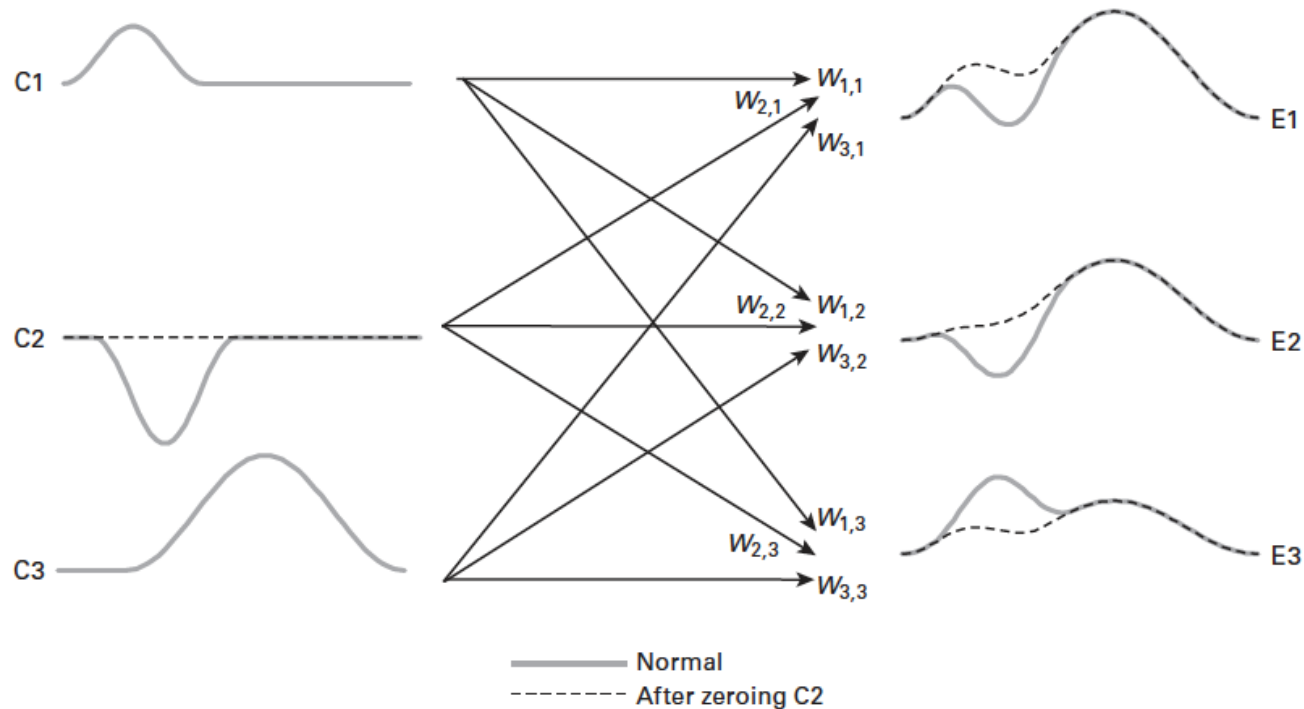
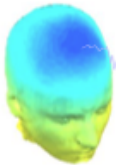


Figure S6.1

Reminder of how intracranial ERP sources propagate to the scalp electrodes. The voltage at each electrode is simply the weighted sum of each internal source. If one source is an artifact, we could eliminate the contribution of this source by setting it to zero and then recomputing the voltage at each electrode site. This is illustrated here by showing what happens when we set the activity of component C2 to zero and recompute the waveforms at each electrode site (blue line).

# **“Secrets” to a good ICA decomposition**



- Garbage in... garbage out (it's not magic)
- Remove large, non-stereotyped artifacts
- Do you have enough data? (based mostly on time, not frames)
- High-pass filter to remove slow drifts (no low-pass filter needed)
  - Remove bad channels



## Main types of artifacts

### I. Environmental electrical activity

- ▶ Line frequency noise from video monitors, and other electrical devices

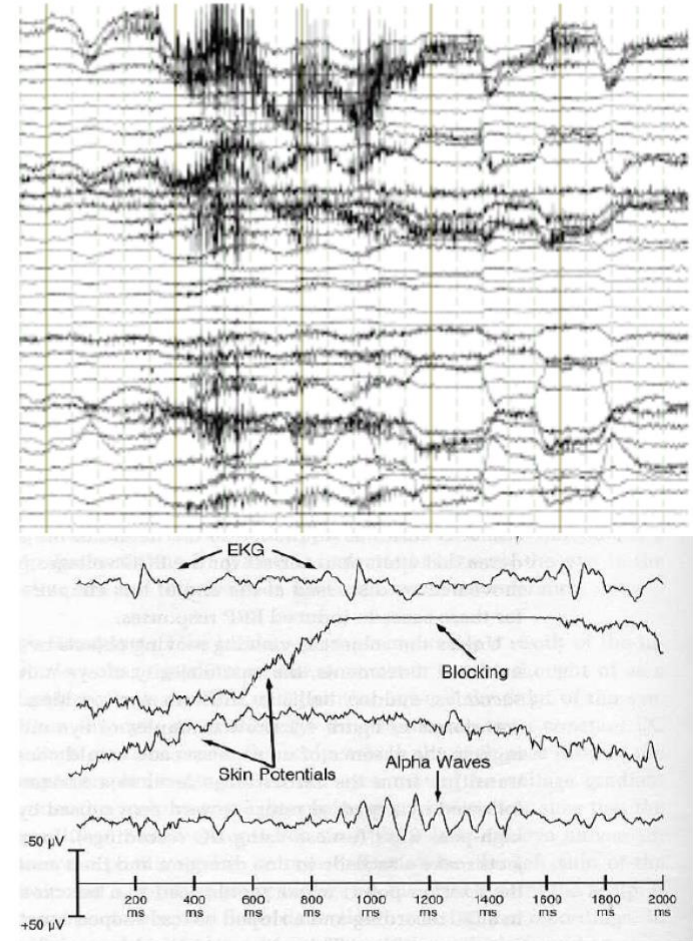
### II. Artifactual bioelectric activity

- ▶ Blinks & eye movements
- ▶ Muscle (EMG) & heart activity (EKG)
- ▶ Skin potentials (=slow voltage shifts)

### III. EEG activity not elicited by the stimuli

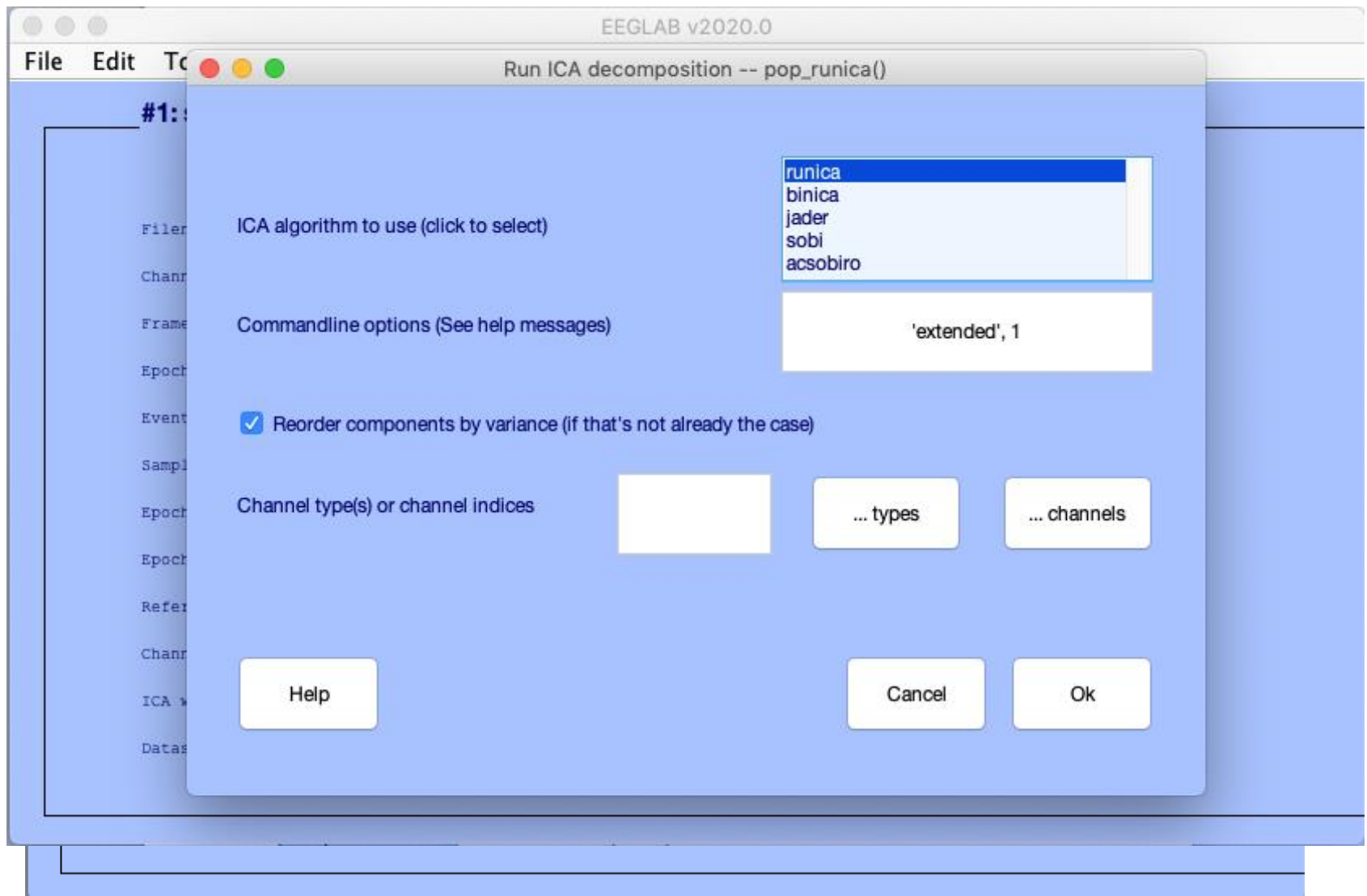
- ▶ Alpha waves

### IV. EEG trial-to-trial variability due to variations in neural/cognitive activity

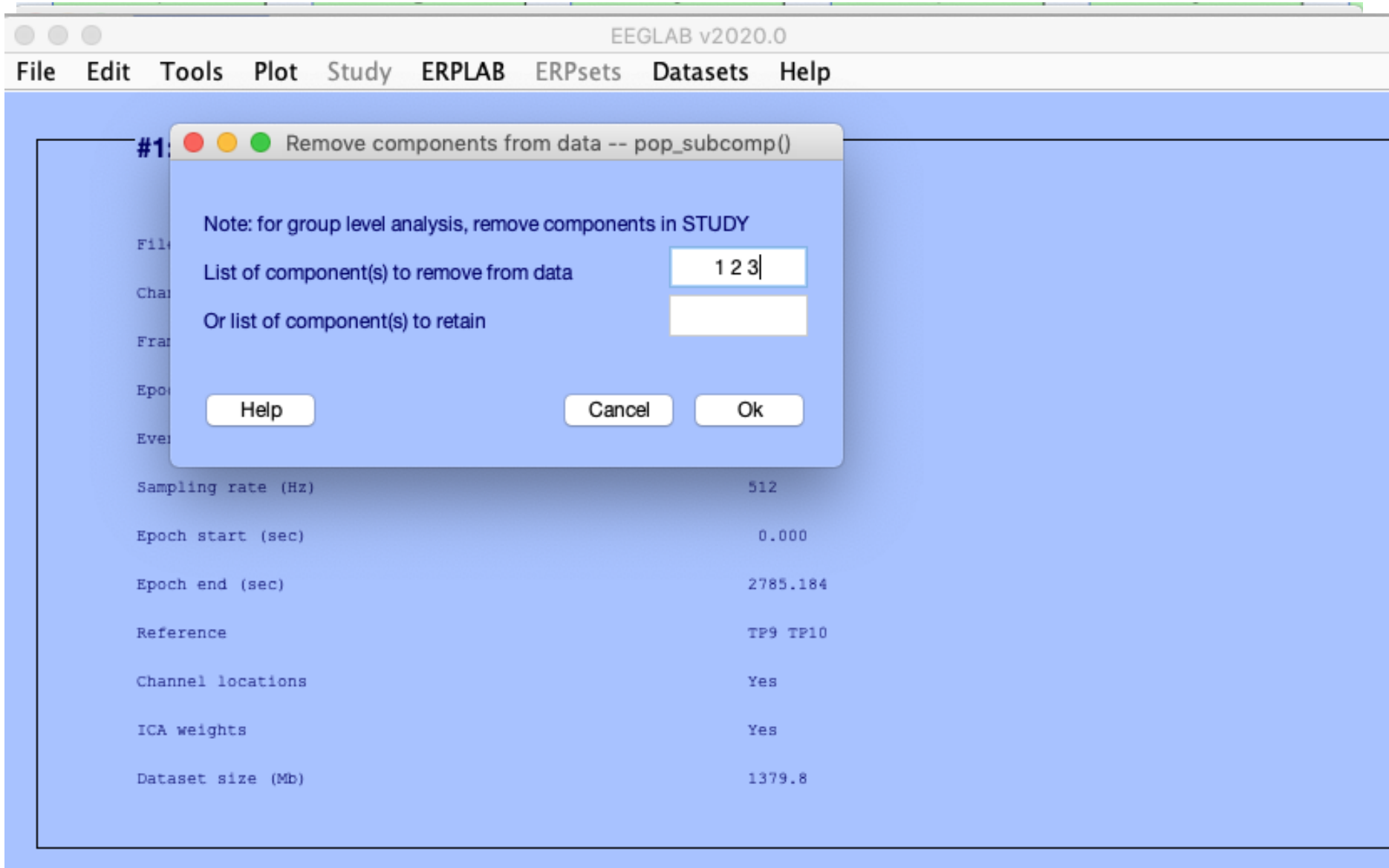




## EEG decomposition using ICA



# EEG decomposition using ICA



And finally averaging.

Underlying logic ... is that ERPs are embedded in larger EEG waves.

Thus, activity that is unrelated to specific sensory, cognitive, or motor events will be cancelled out ...

