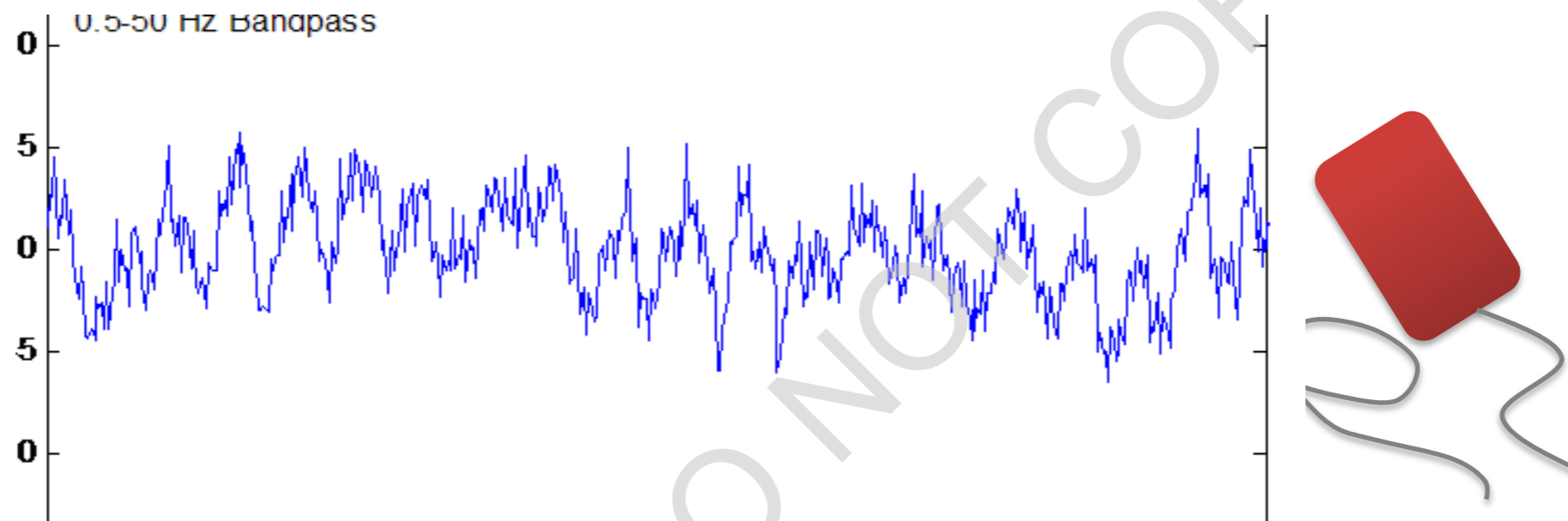


Combining tCS and EEG



Davide Cappon, PhD

- Berenson-Allen Center for Non-invasive Brain Stimulation, Department of Cognitive Neurology | Beth Israel Deaconess Medical Center | Harvard Medical School | Boston, MA, USA

dcappon@bidmc.harvard.edu

axies that can be seen today make up j

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NASA

Observable Universe



Observable Universe Planet Earth

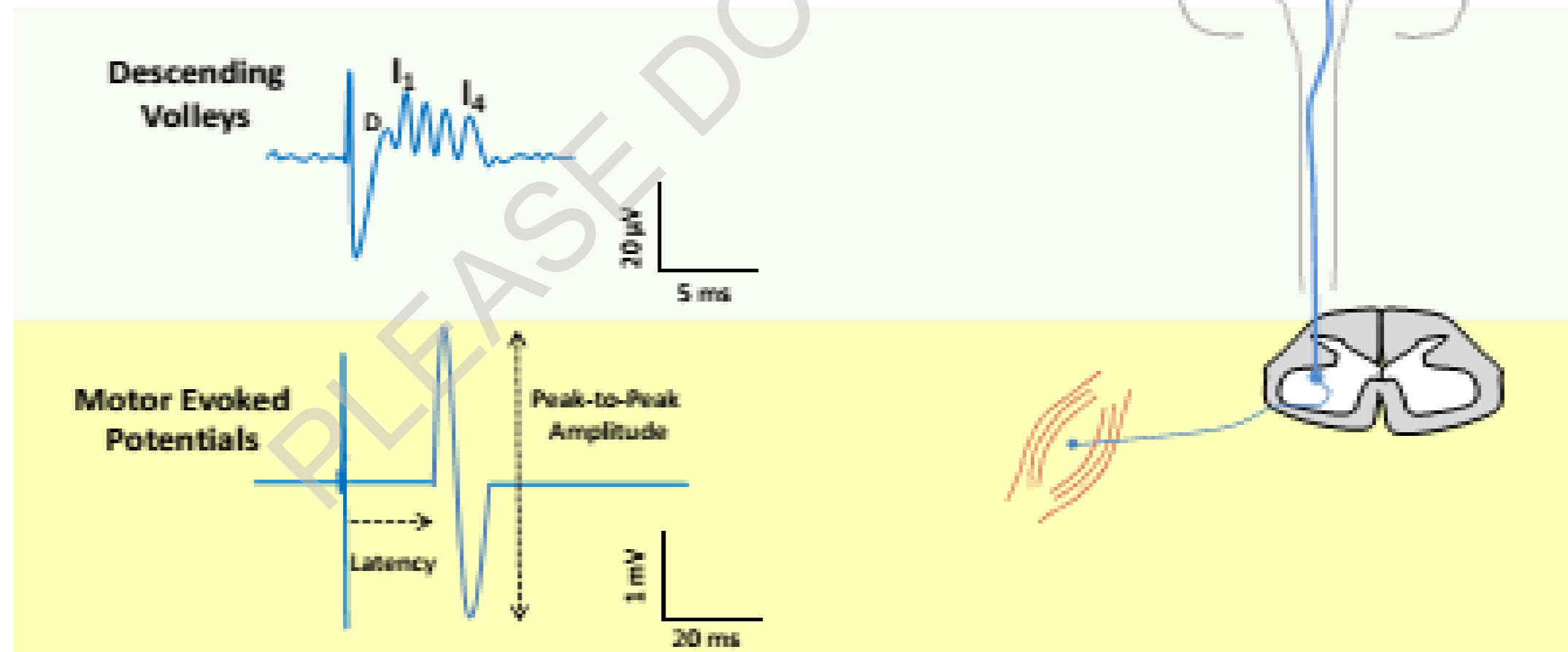


- **Measuring tCS effects with EEG**
 - Measuring effects outside the motor cortex
 - Measuring focality of tCS interventions
- **Basics of EEG**
 - EEG signal: features and opportunities
 - Analysis (ERP, Power, ...)
 - Experimental example of EEG-tCS combination
- **Beyond EEG**
 - TMS-EEG recording

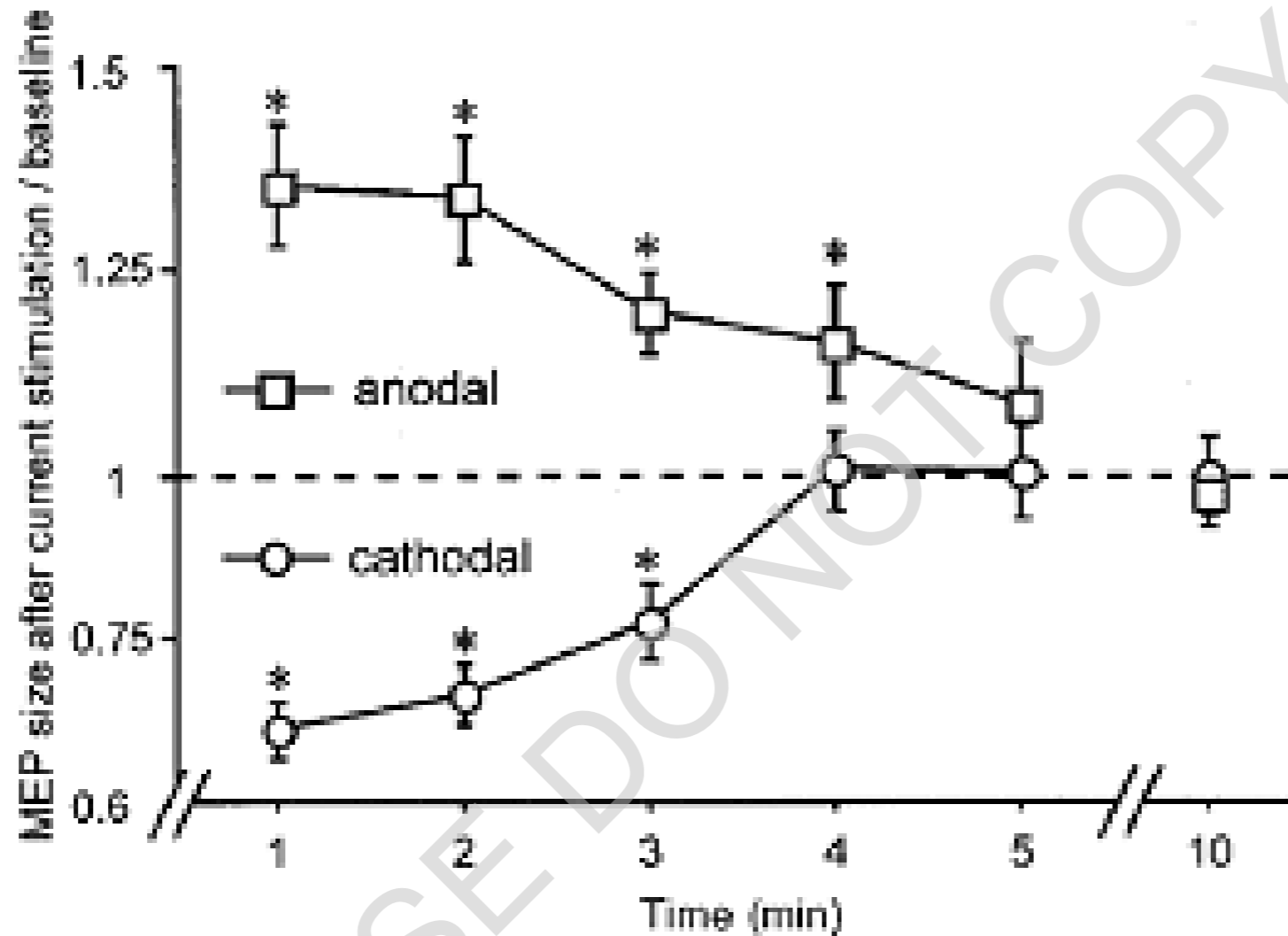
Corticospinal excitability as an index of Brain excitability

Applied to tCS: limitation for online recording, **only after effects**

Transcranial Magnetic Stimulation + Electromyography



Measuring tCS effects without EEG

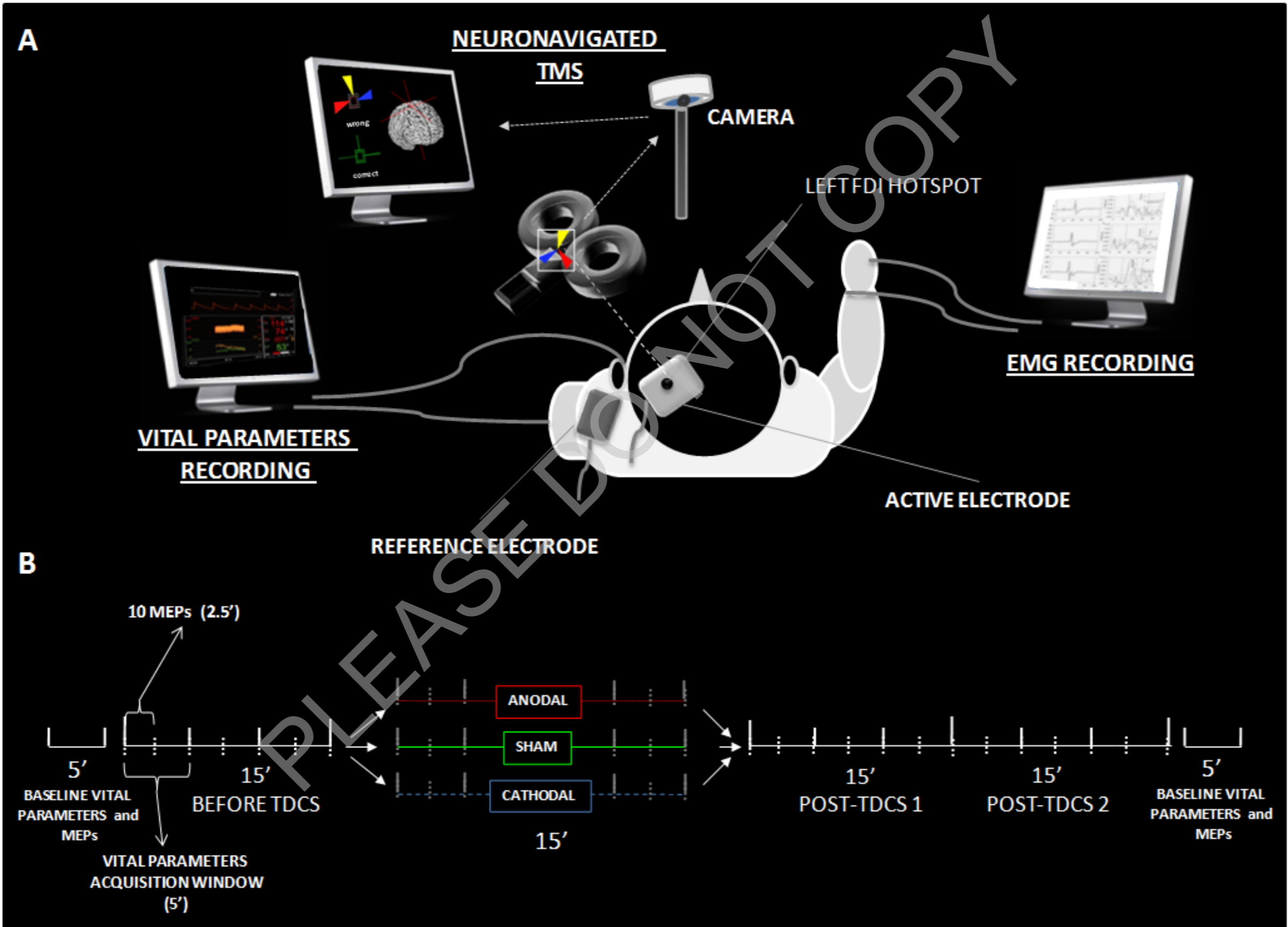


First evidence of tDCS after effect from **Nitsche and Paulus, 2000**

Changes in cortical excitability assessed using TMS-EMG

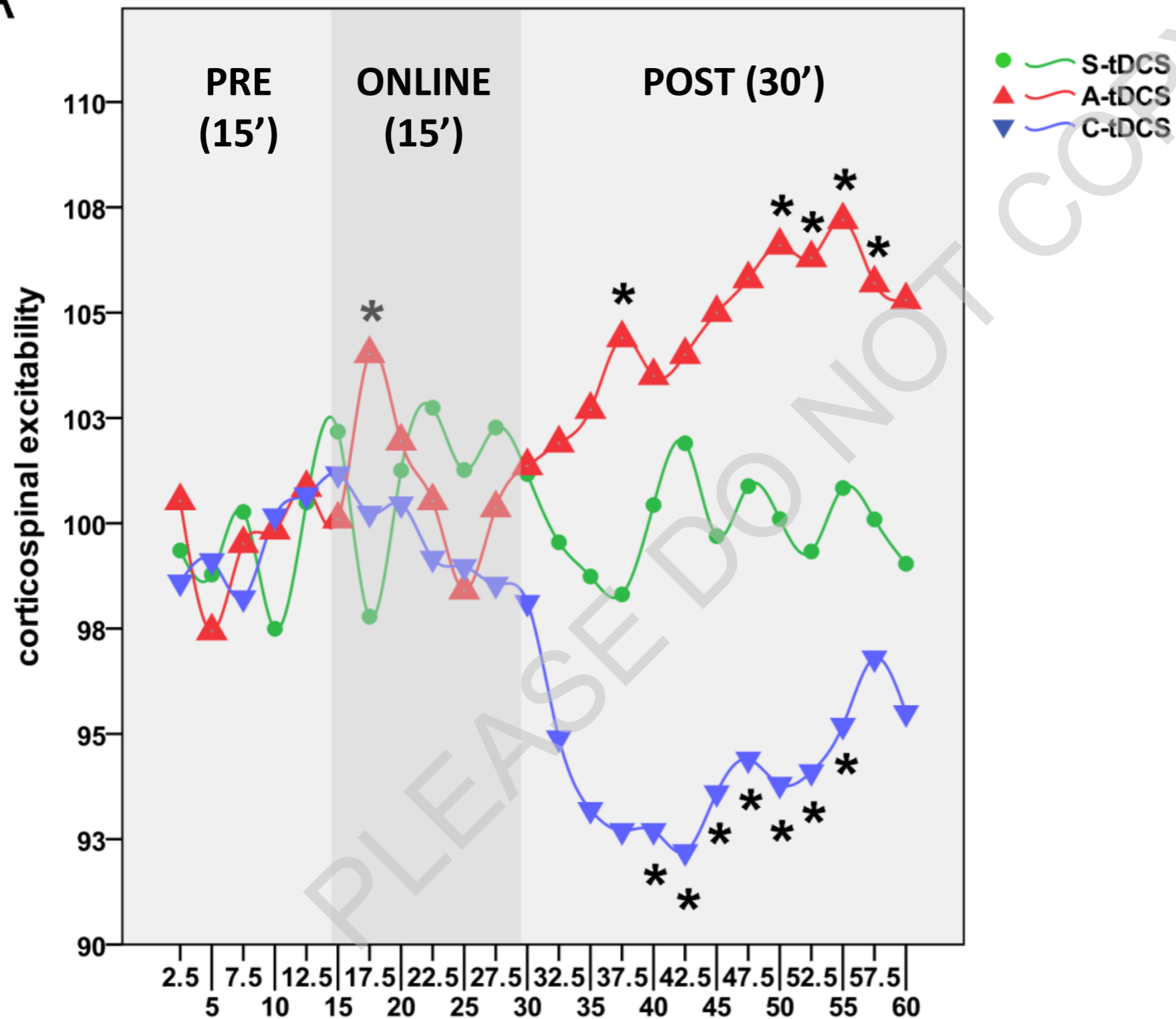
tDCS effect on corticospinal excitability: Online and Offline effects

Santarneckchi et al., 2014



tDCS Effects on the motor cortex: pre/during/post

A



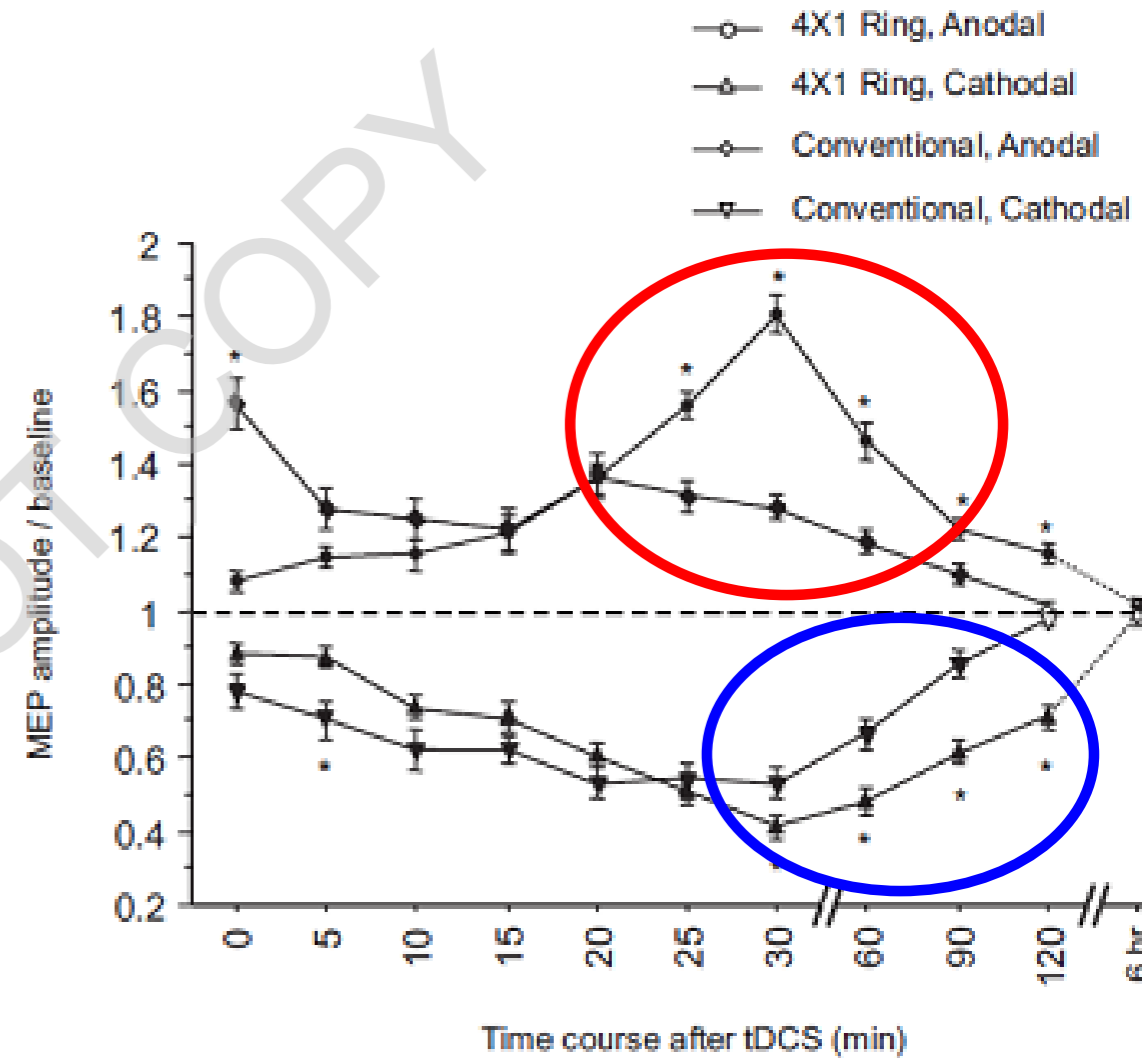
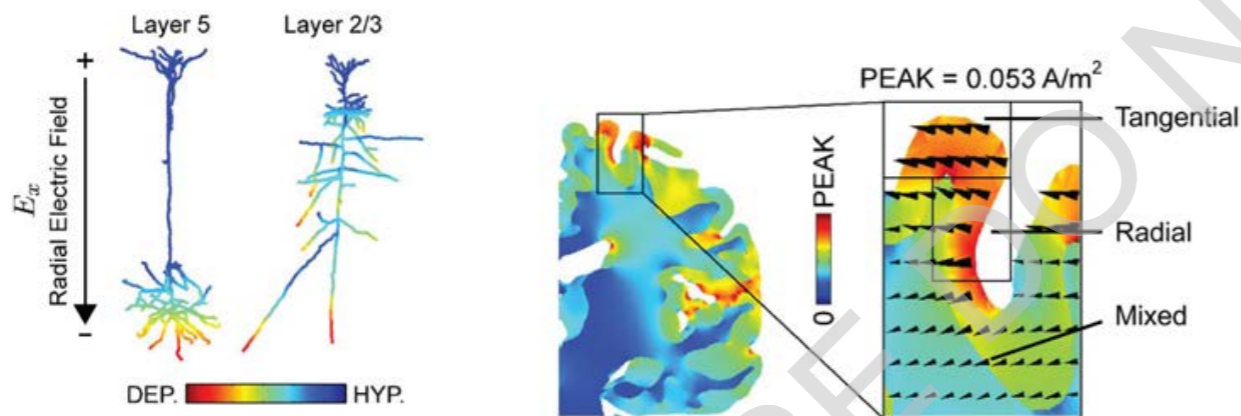
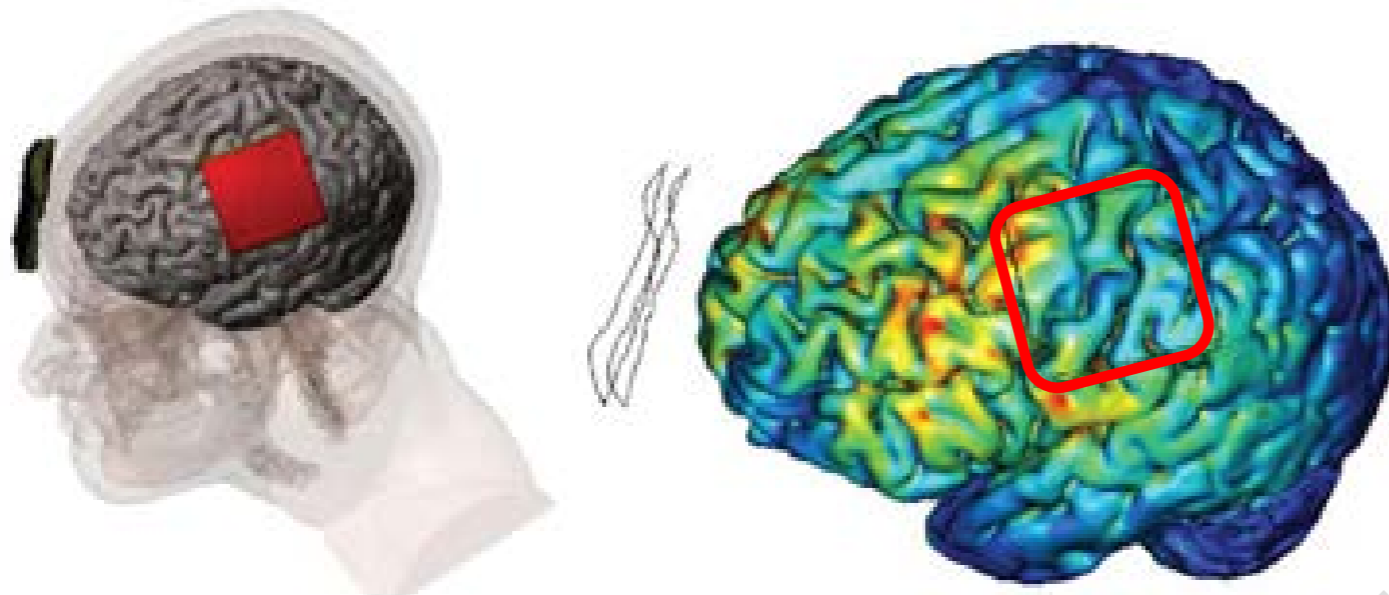
Anodal and **Cathodal** tDCS modulate (increase/decrease excitability) right after the stimulation respect to Sham.

No significant effects During the stimulation.

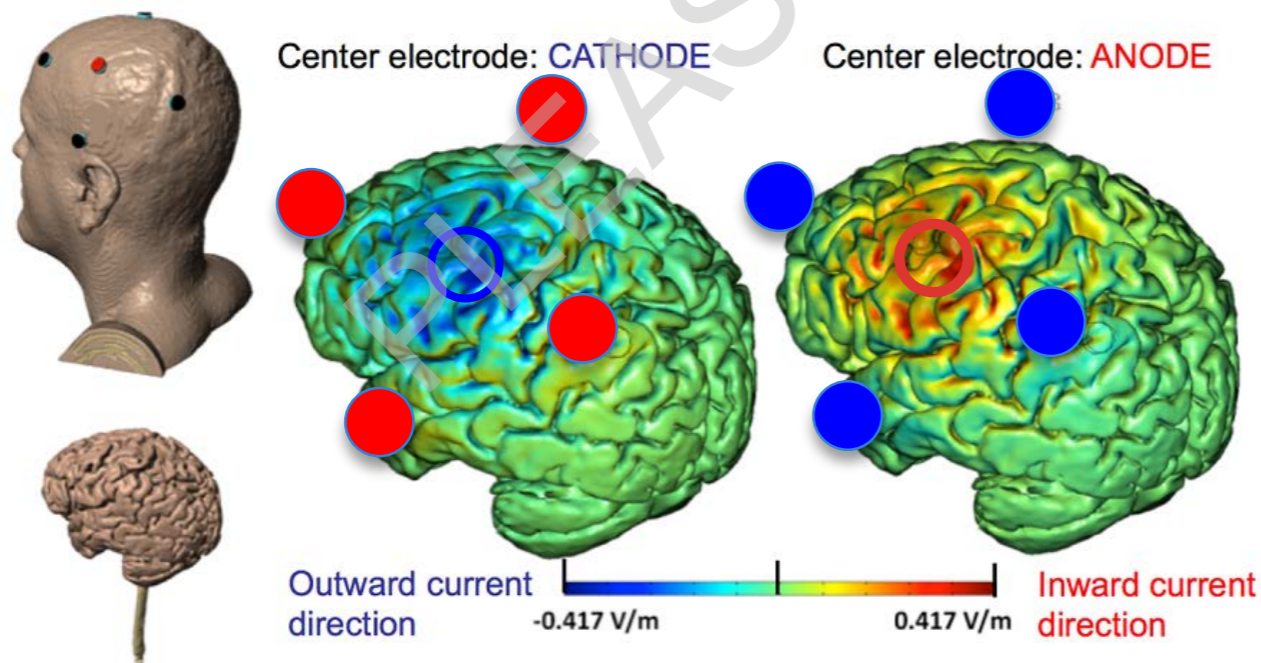
Still limited to the motor cortex!

Are we stimulating the motor cortex?

Kuo et al., 2013



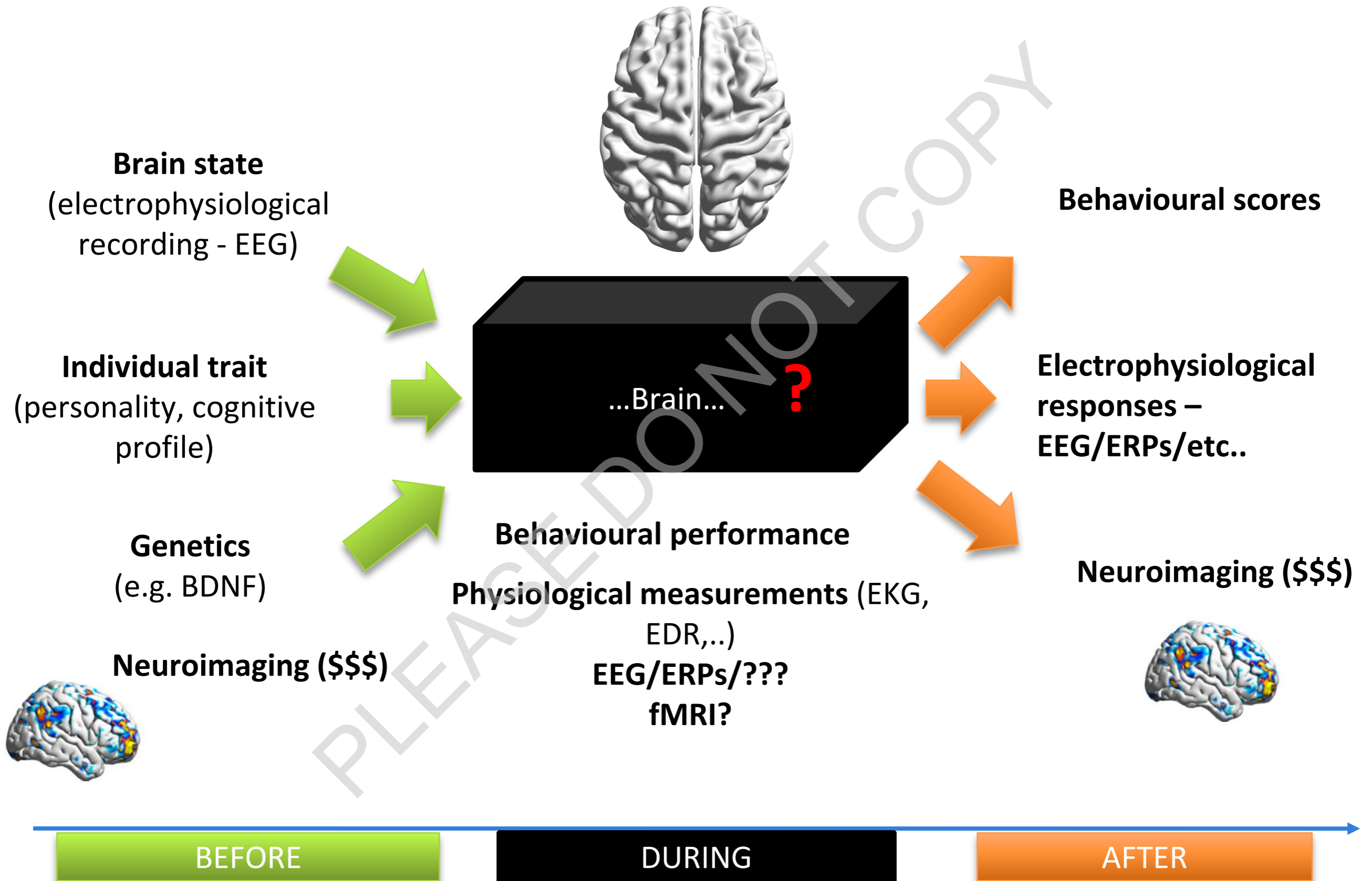
HD-tDCS



Montage, Timing, Stimulation site, Duration, Intensity, etc. suggest a complex scenario underlying tCS effects

TMS-EMG is not enough

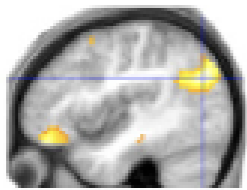
Multifactorial model



Targeting Optimization

Where to stimulate?

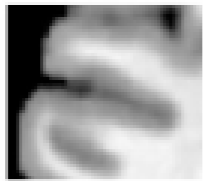
Determine **target site & device position/orientation** for stimulation based on...



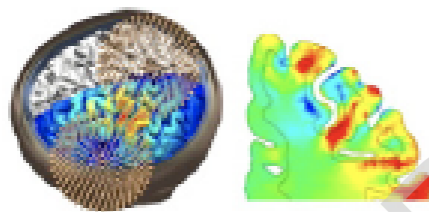
functional localizer



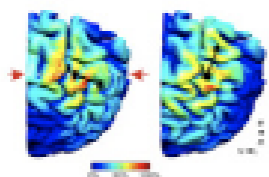
source localization



individual gyral anatomy



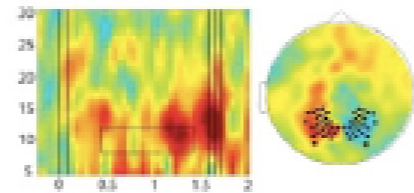
local strength of electric field



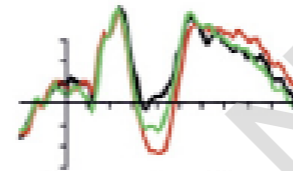
local direction of current flow

When to stimulate?

Determine **target onset/time window** relative to task or spontaneous event for stimulation based on...



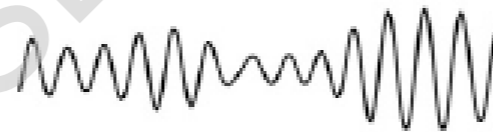
induced power



latency of evoked responses



oscillatory phase



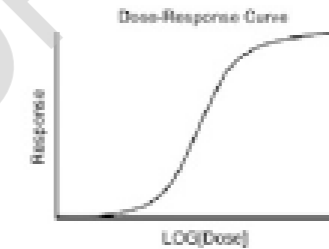
oscillatory power



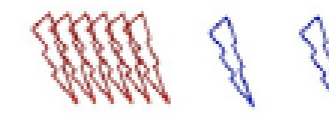
occurrence of specific events

How to stimulate?

Determine **specific parameters** for stimulation such as...



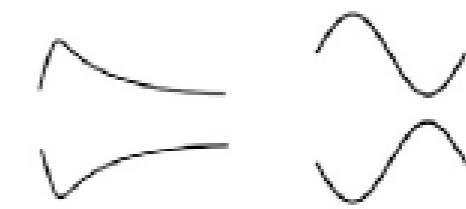
stimulation intensity



stimulation frequency



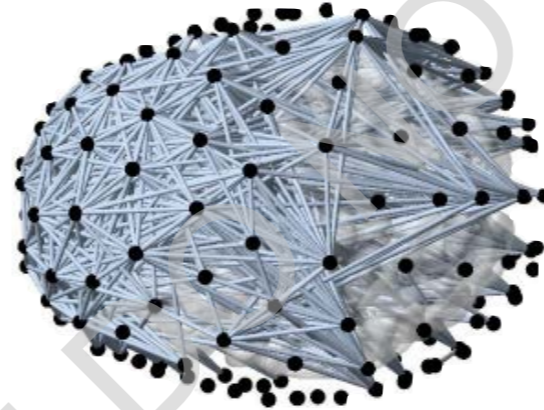
pulse/wave form



polarity

Open questions..

- the effect of tCS on Non-Motor regions?
- distant effects and changes in the interplay between regions (connectivity) → **Network** effects?

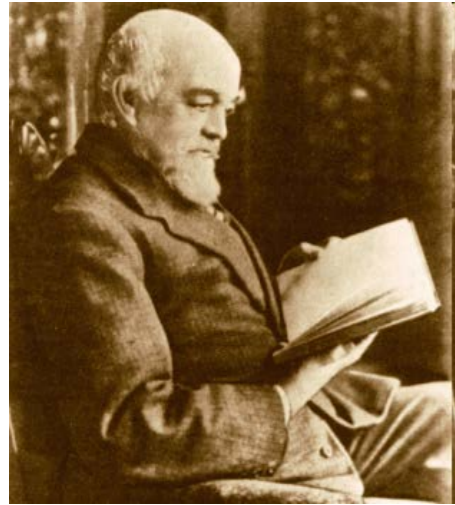


- the Online effects of tCS on brain activity other than “excitability”?



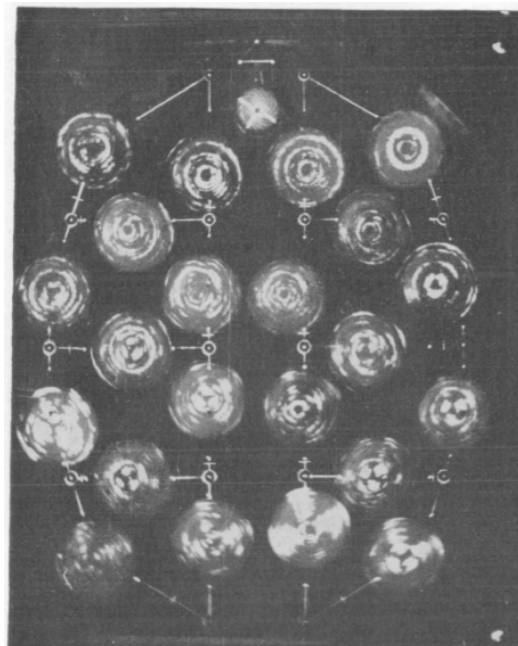
**Useful information to define tCS parameters
and increase efficacy of interventions**

Electroencephalography



1875: Richard Caton (1842-1926) measured currents in between the cortical surface and the skull, in dogs and monkeys

1929: Hans Berger (1873-1941) first EEG in humans (his young son), description of alpha and beta waves

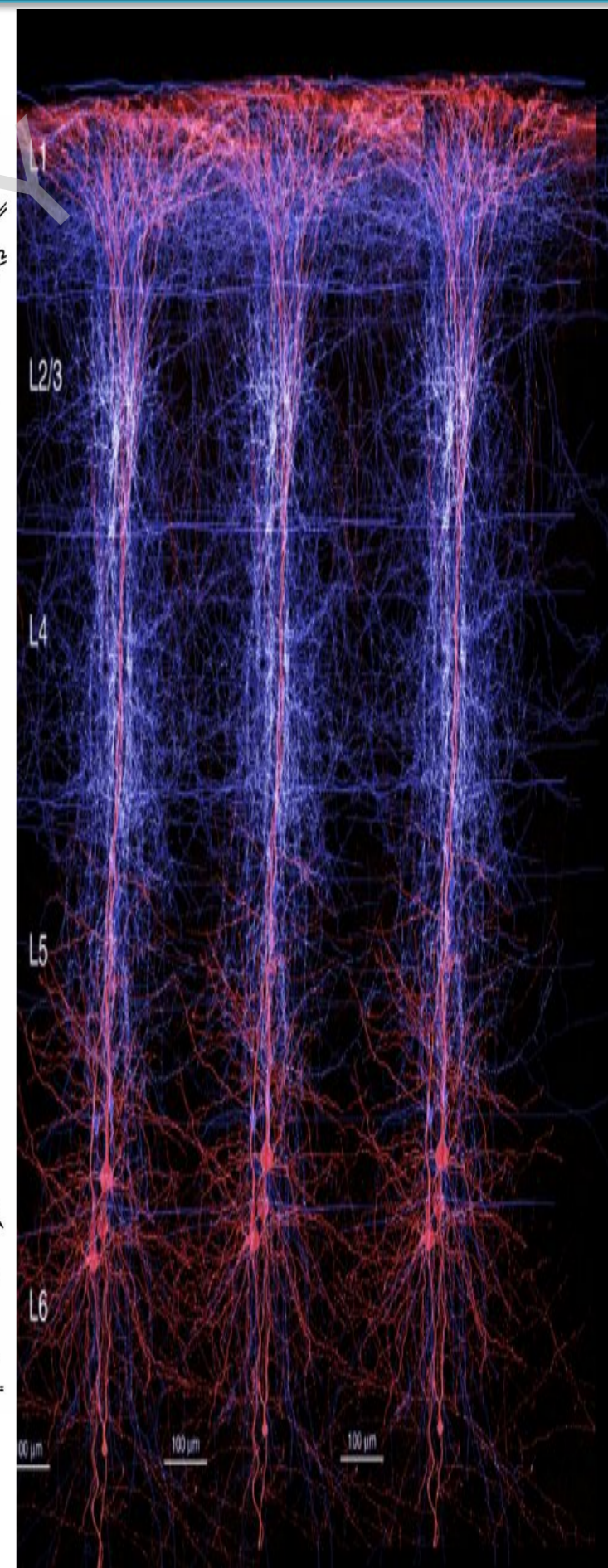
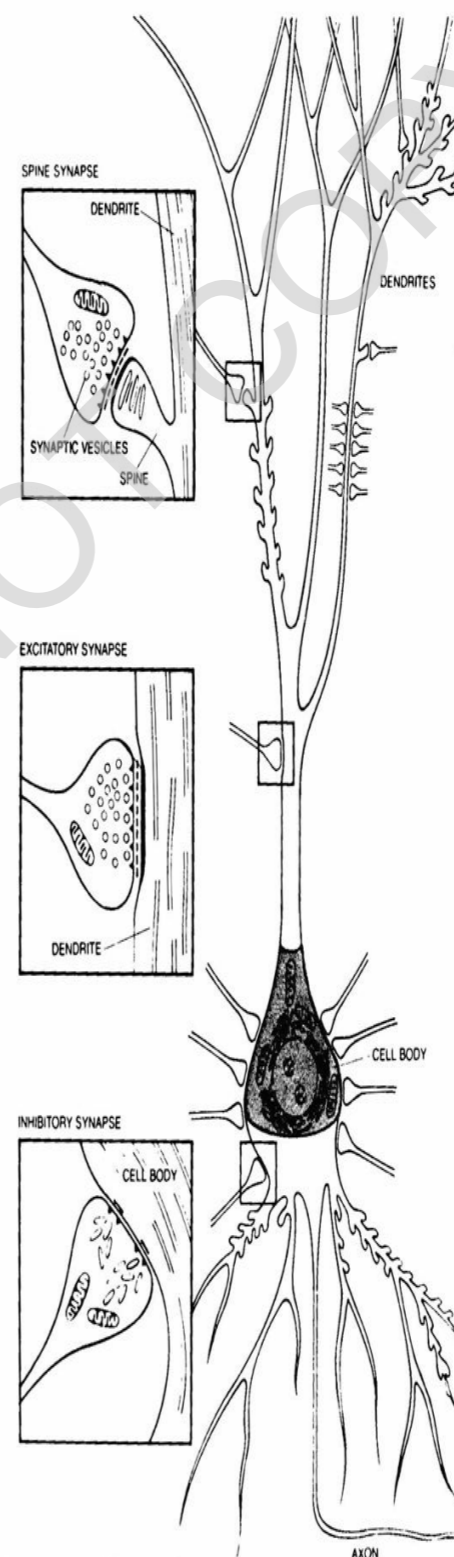
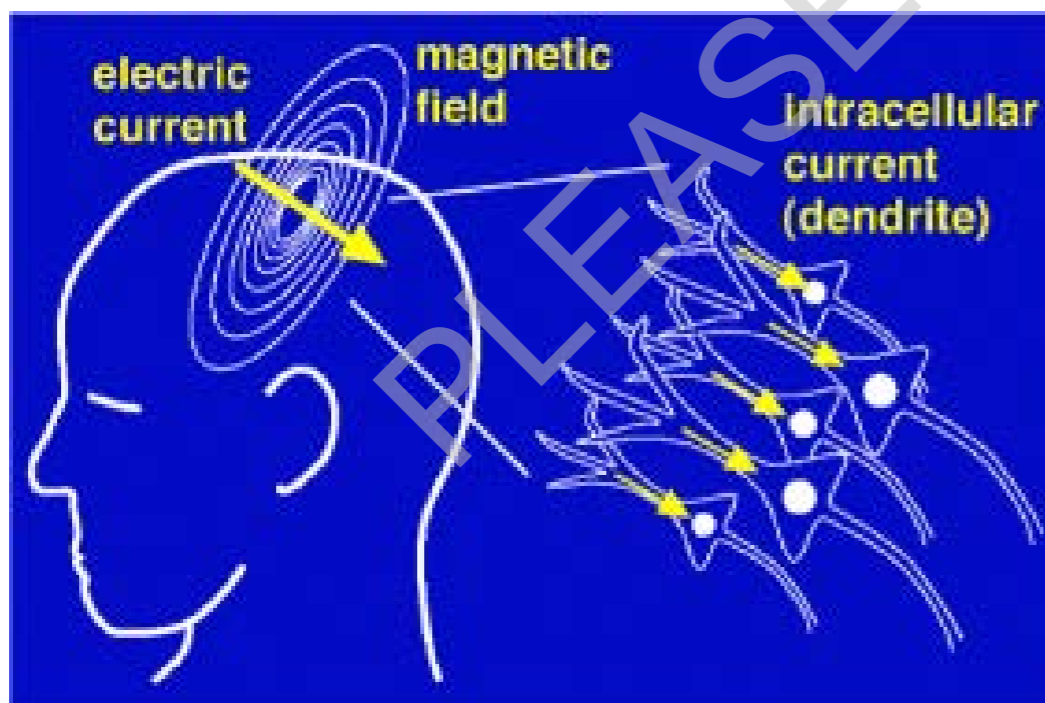


1950s. Grey Walter (1910 – 1977). Invention of topographic EEG maps.

Electroencephalography

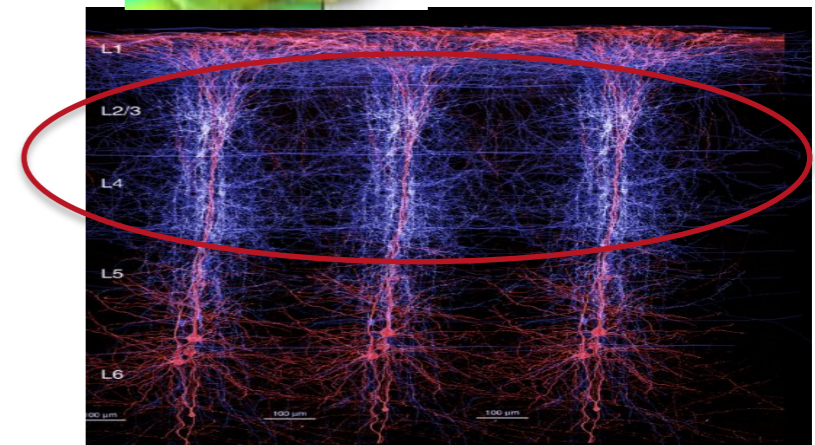
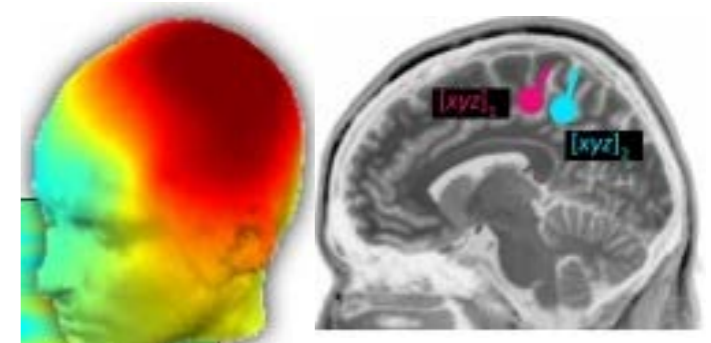
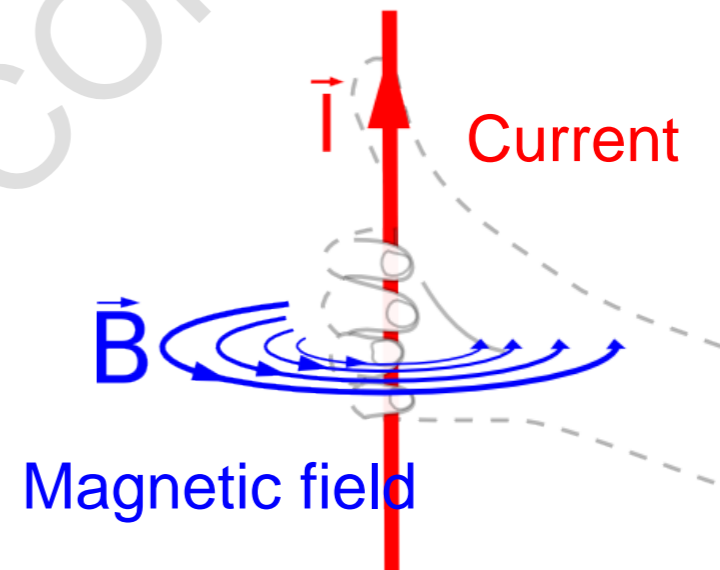
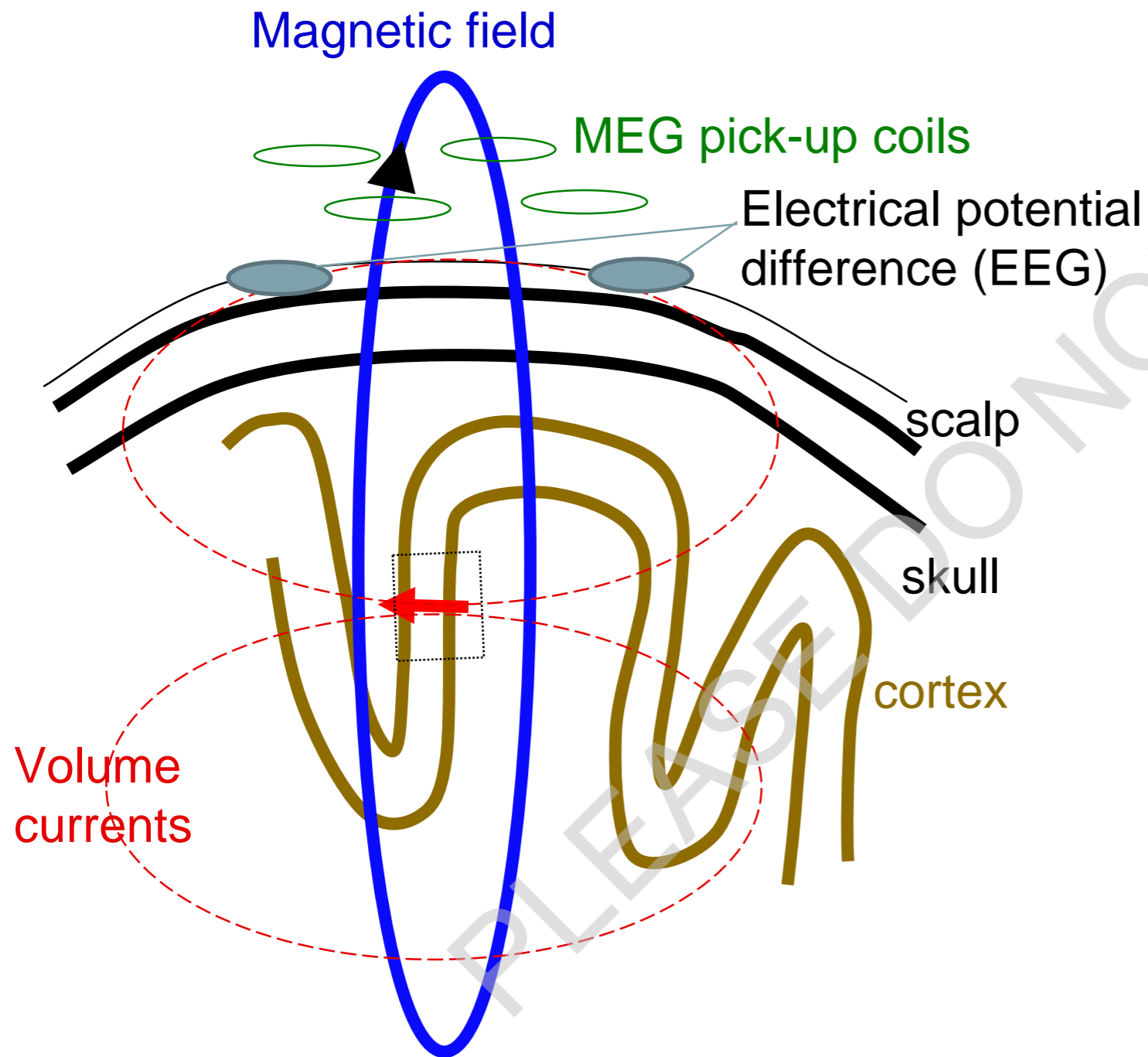
Where does the signal come from?

- Signals stem from **synchronous activity of large (~1000s) groups of neurons** close to each other and exhibiting similar patterns of activity
- Most of the signal generated by **pyramidal neurons in the cortex** (parallel to each other, oriented perpendicular to the surface)
- EEG measures **synaptic currents**, not action potentials (currents flow in opposite directions and cancel out!)



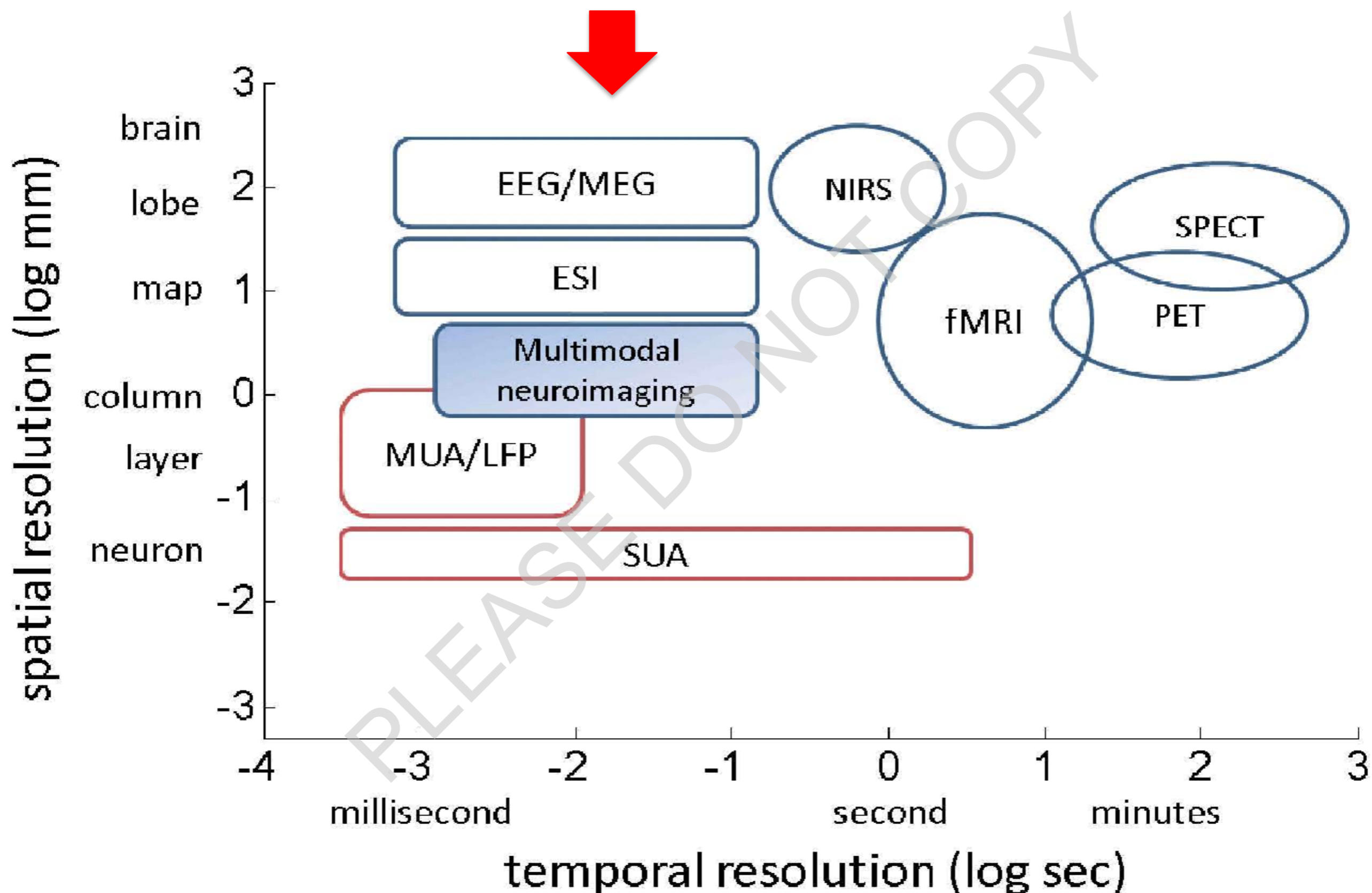
Electroencephalography

Primary intracellular currents give rise to volume currents and a magnetic field



Volume currents yield potential differences on the scalp that can be measured by EEG

Pros and cons of EEG



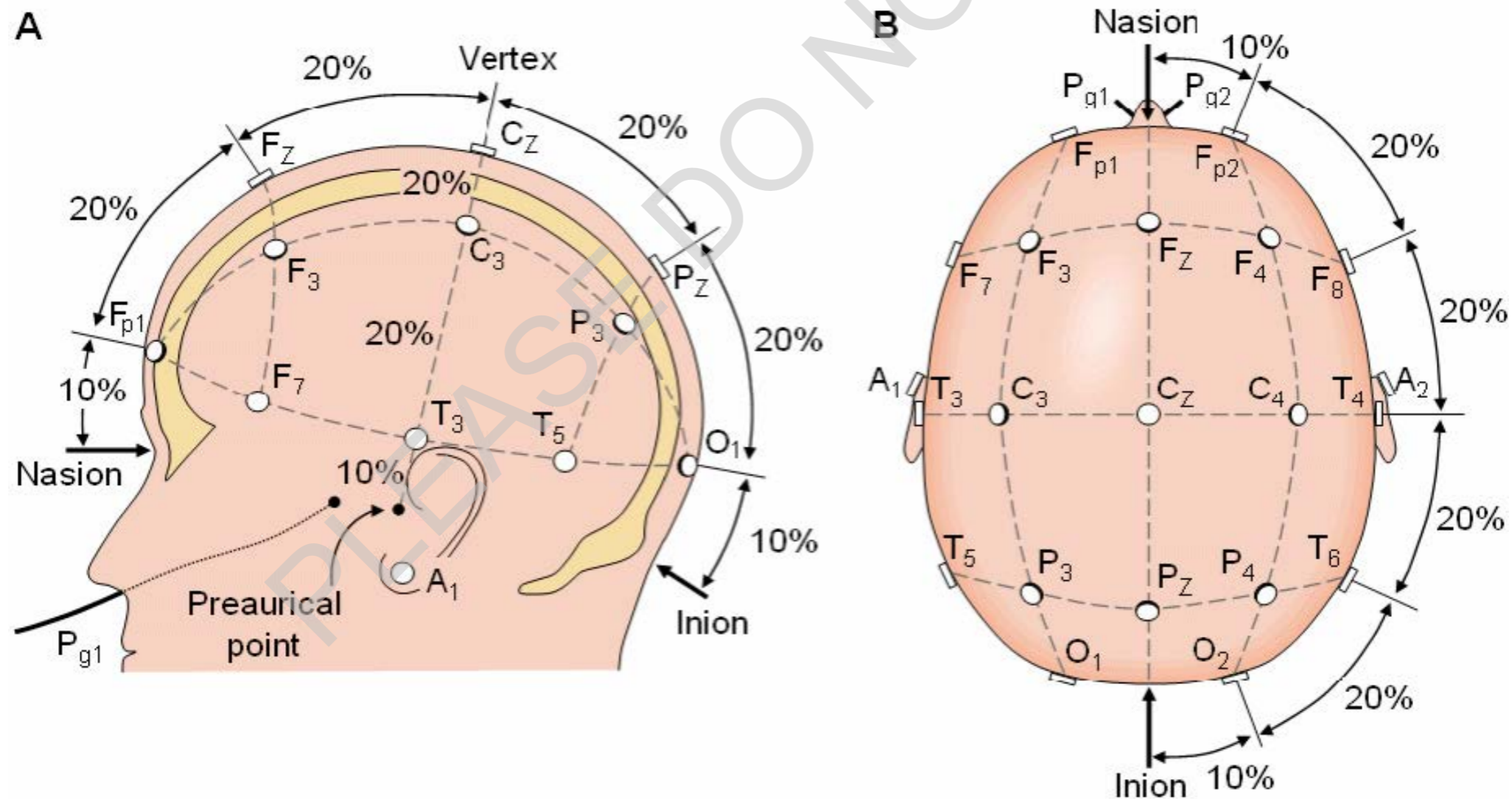
EEG recording and analysis

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EEG recording

- International 10-20 system
- Left side: odd numbers
- Right side: even numbers
- Numbers increase from the hemispheric line towards the edges. Letter indicates brain regions (lobes).

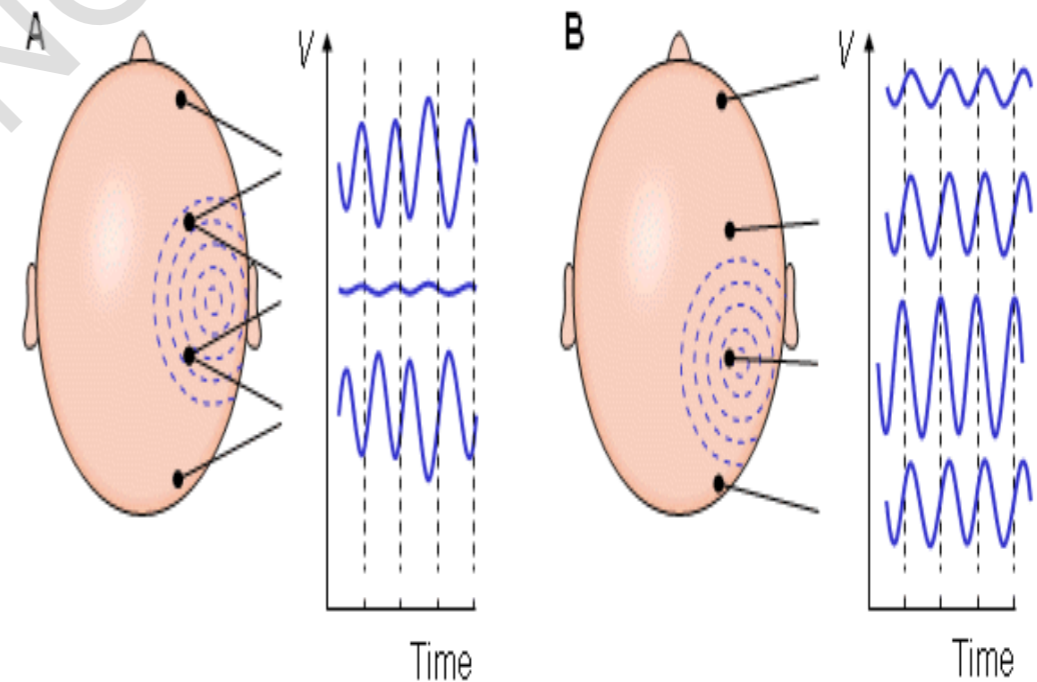
High-Density EEG (64-256 Channels)



EEG recording

- EEG records **potential differences** at the scalp using a set of active electrodes and a reference
- The **ground electrode** is important to eliminate noise from the amplifier circuit
- Potential differences are then **amplified**

- The representation of the EEG channels is referred to as a montage
 - **Unipolar/Referential** \Rightarrow potential difference between electrode and designated reference
 - **Bipolar** \Rightarrow represents difference between adjacent electrodes (e.g. ECG, EOG)



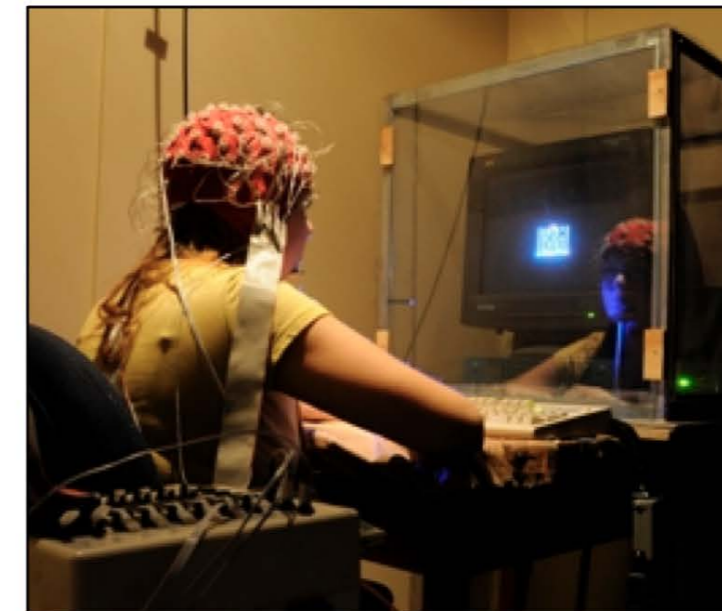
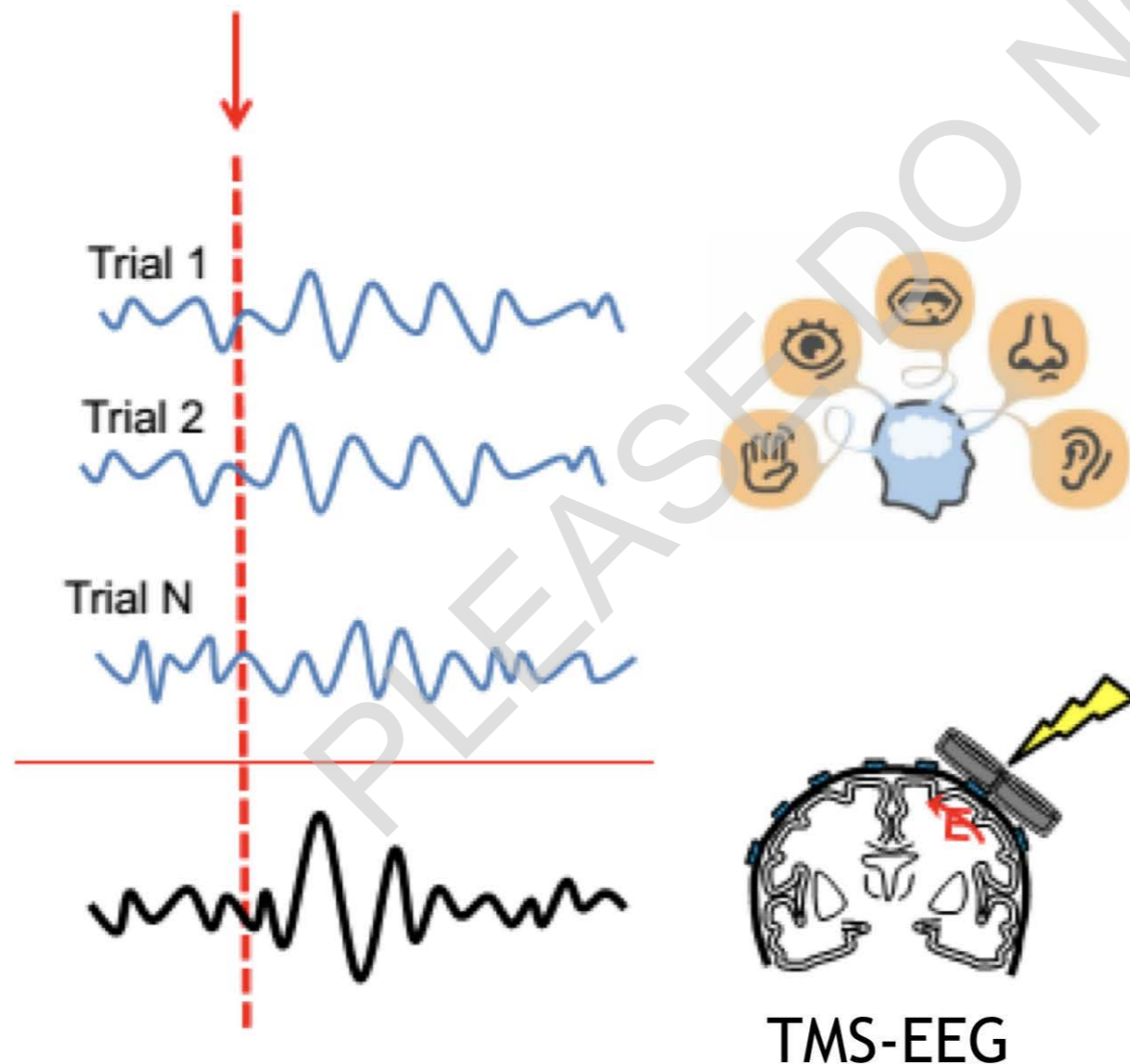
EEG recording

1. SPONTANEOUS

- Meaningful data with ~5' of recording
- Eyes open/closed



2. EVOKED



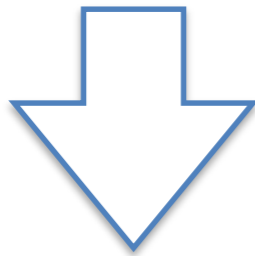
Well known Evoked Response Potential (ERP) (P300, N100, ..)

EEG analysis

From ERPs to Waveform

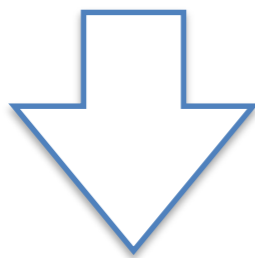
Time domain:

-> **when** do things (amplitudes) happen?



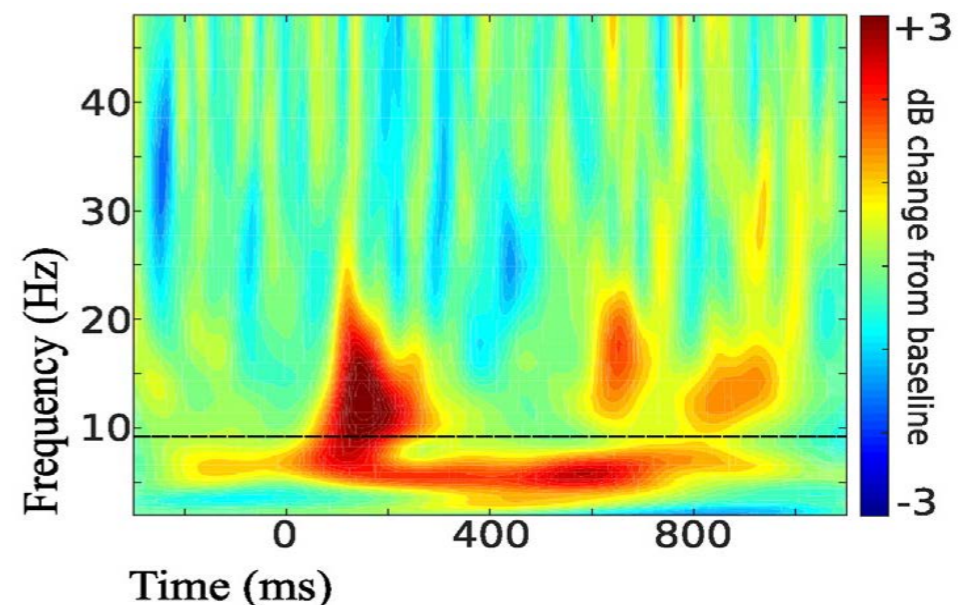
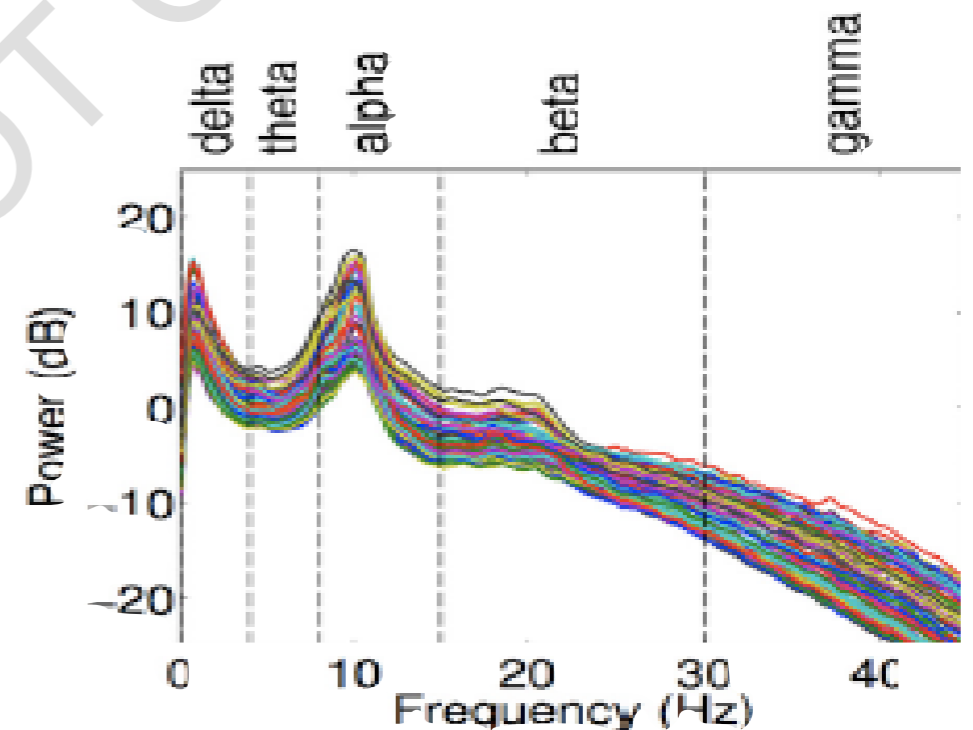
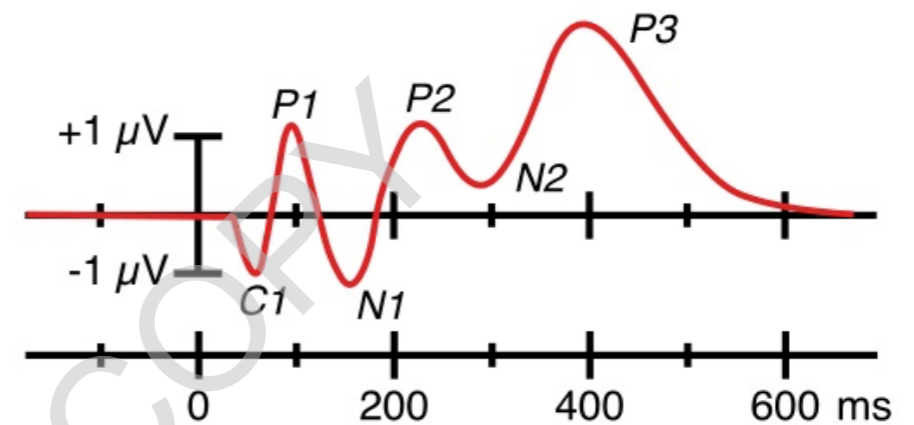
Frequency domain (spectral):

-> **magnitudes** and **frequencies** of waves- no time information.



Time-frequency (wavelet analysis):

-> **when** do which **frequencies** occur?

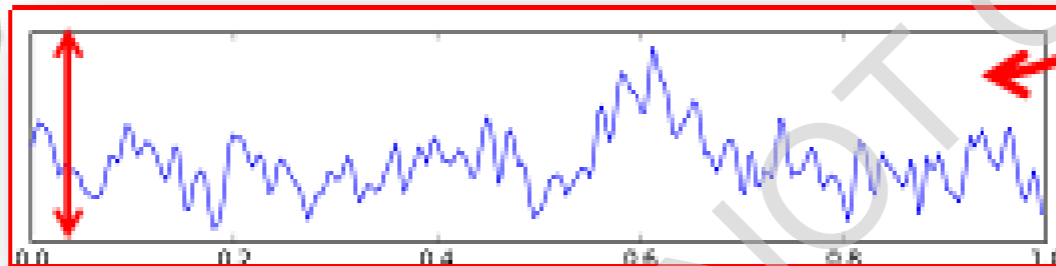


EEG features

$$V(t) = \sum A_n \sin(2\pi f_n t - \phi_n)$$

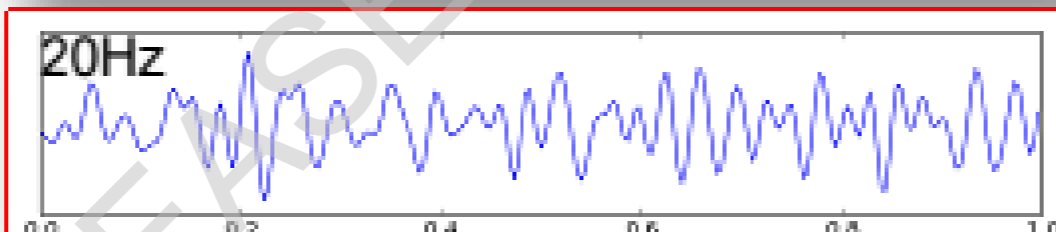
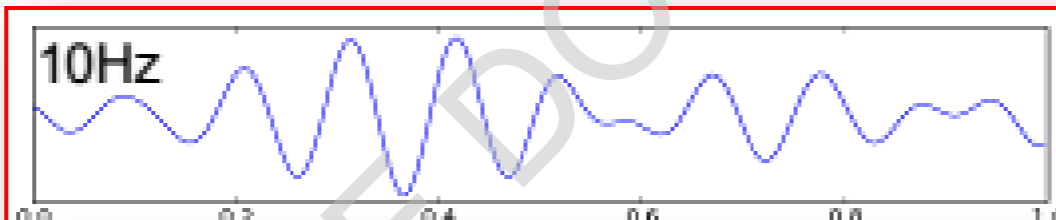
Amplitude (or Power)

Strength
(μV or μV^2)



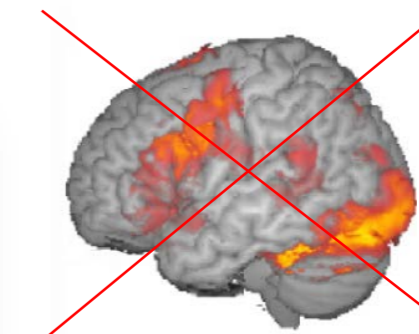
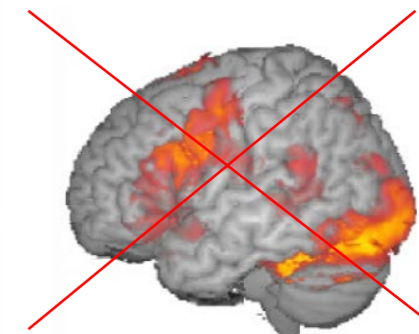
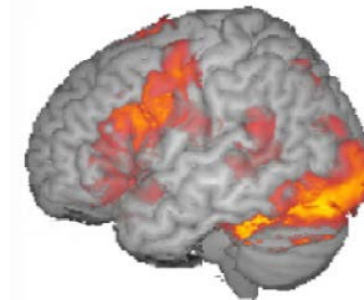
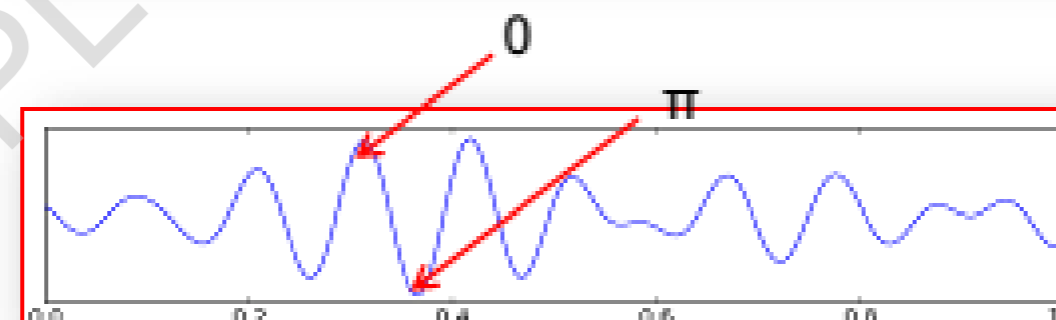
Frequency

of Cycles/Second
(Hz)



Phase

(Radians)



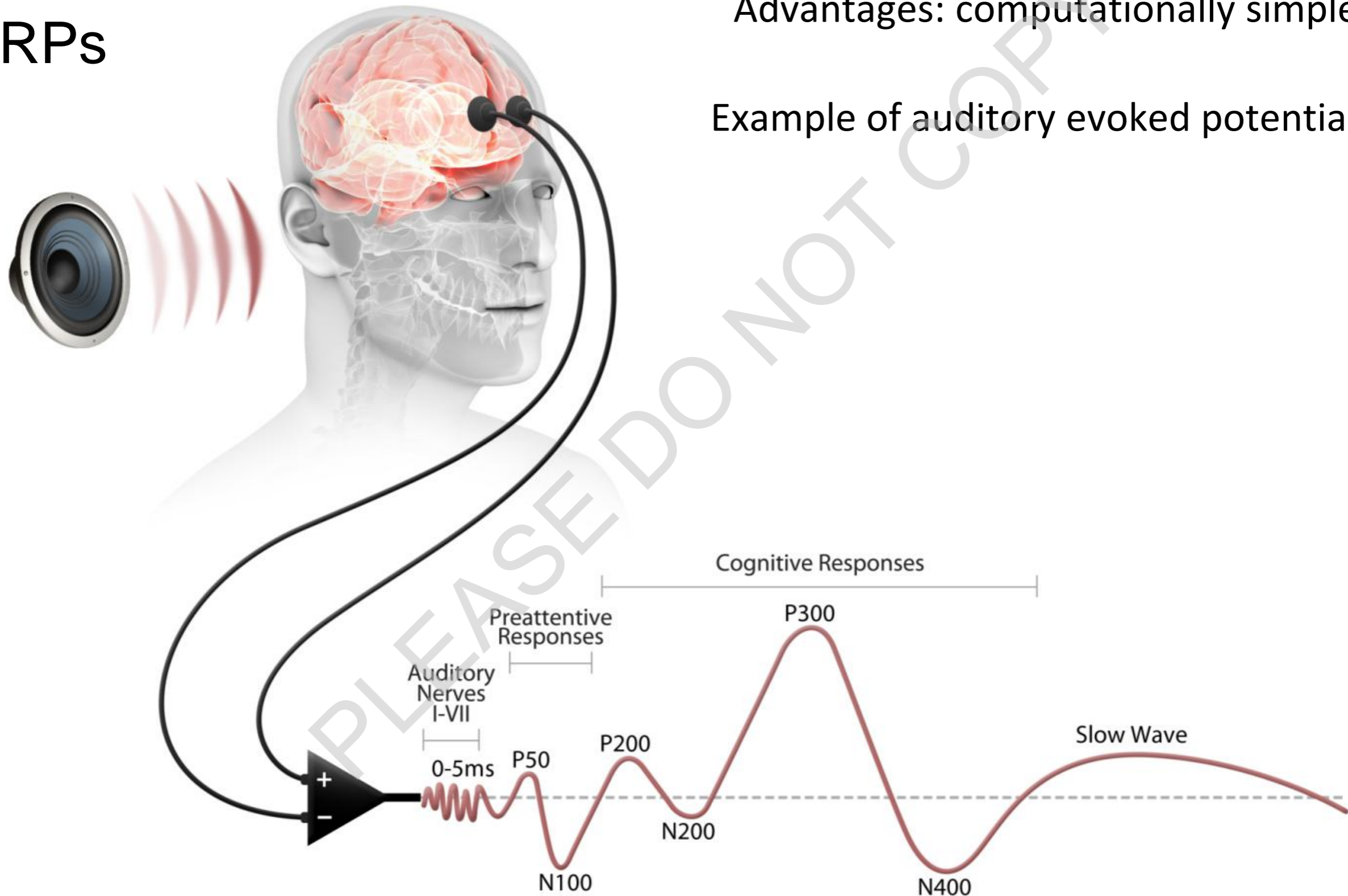
fMRI

Time domain Analysis

Event Related Potentials ERPs

Advantages: computationally simple

Example of auditory evoked potentials

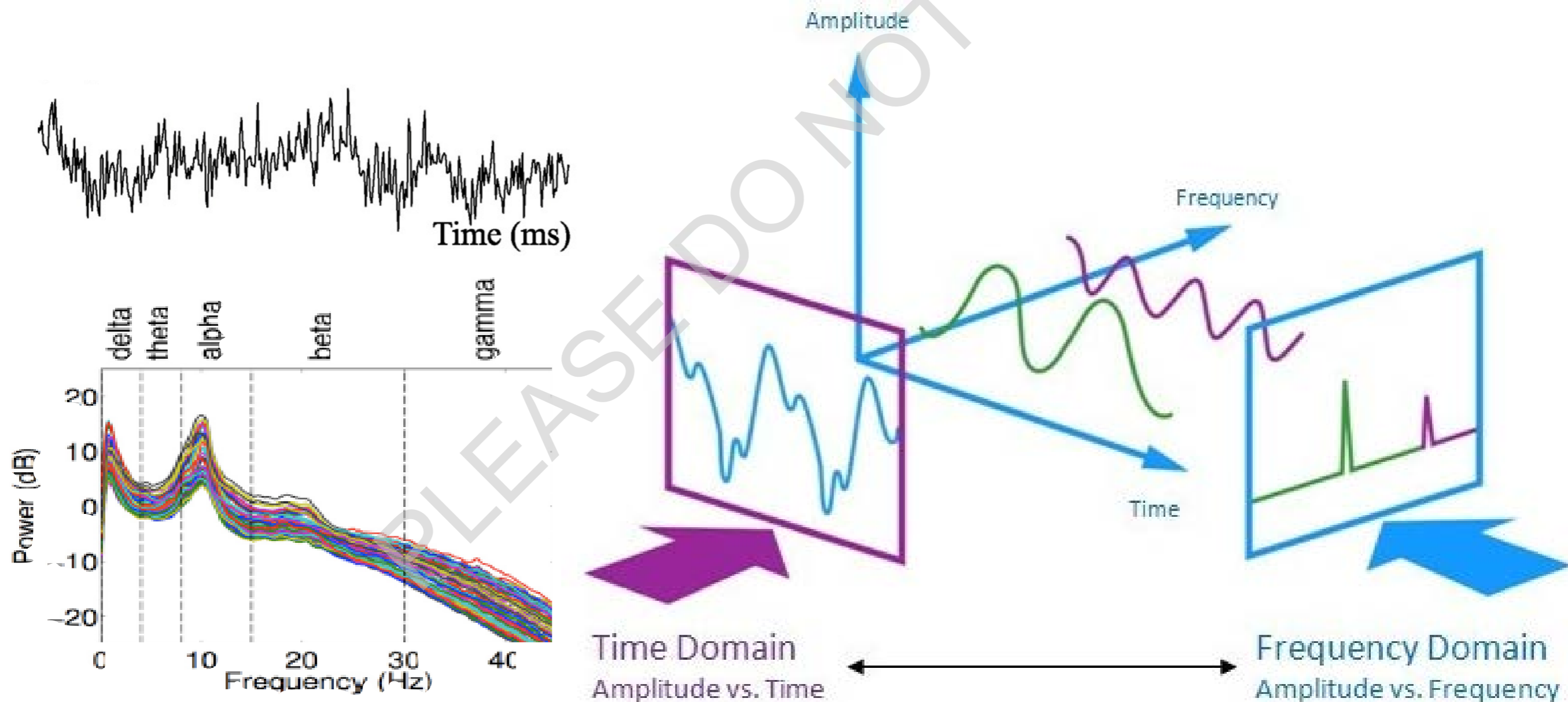


Frequency Domain Analysis (EEG)

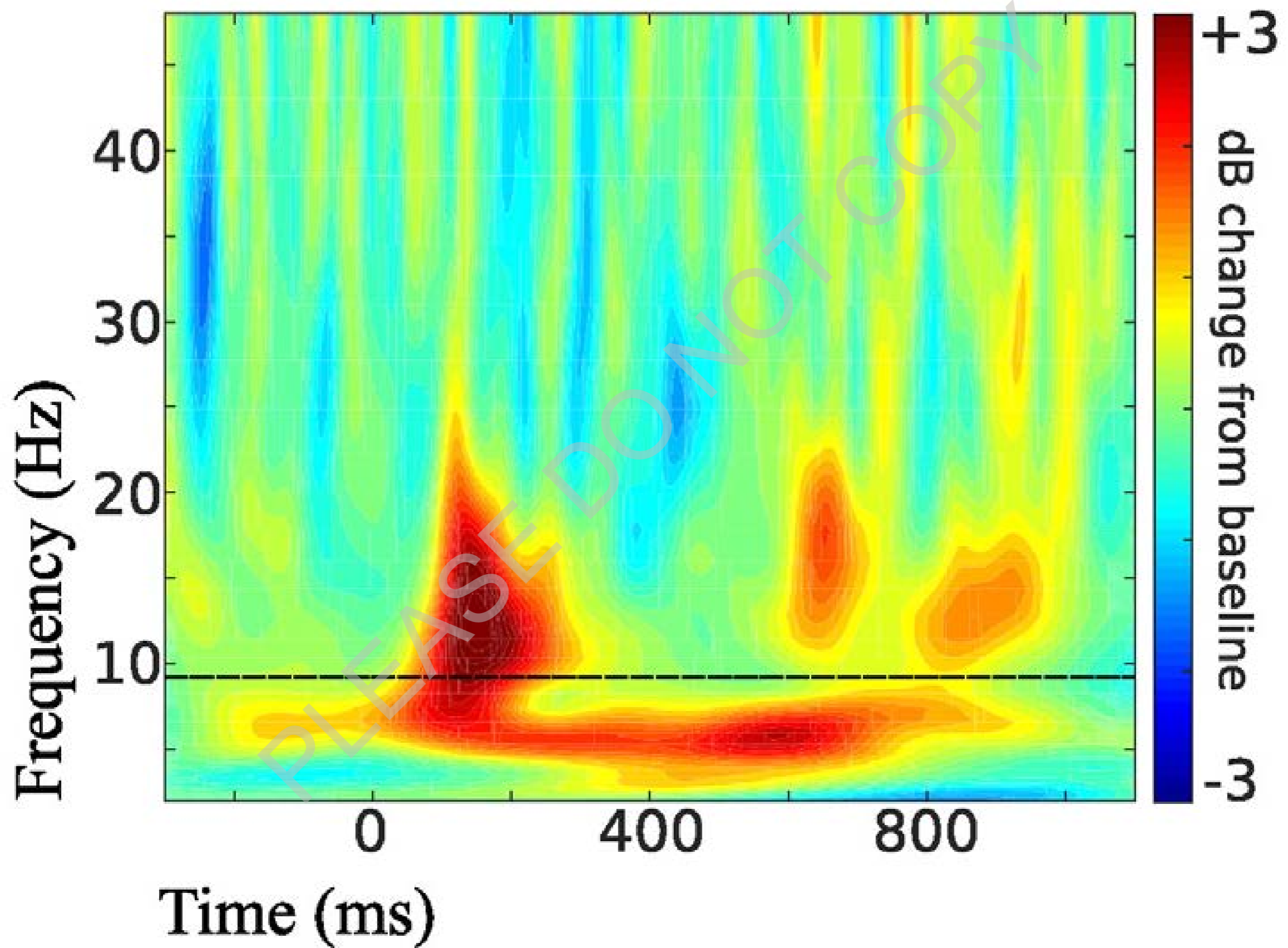
How to disentangle oscillations

Jean Joseph Fourier (1768–1830):

“An arbitrary function, continuous or with discontinuities, defined in a finite interval by an arbitrarily capricious graph can always be expressed as a sum of sinusoids”.



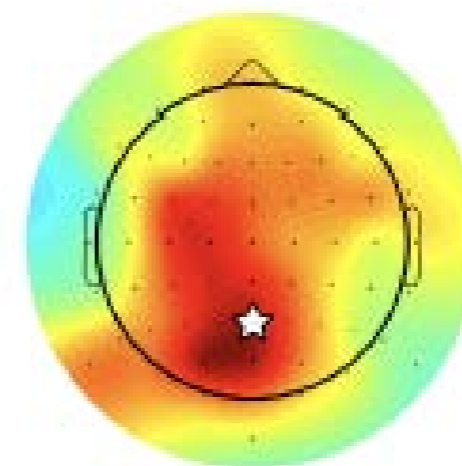
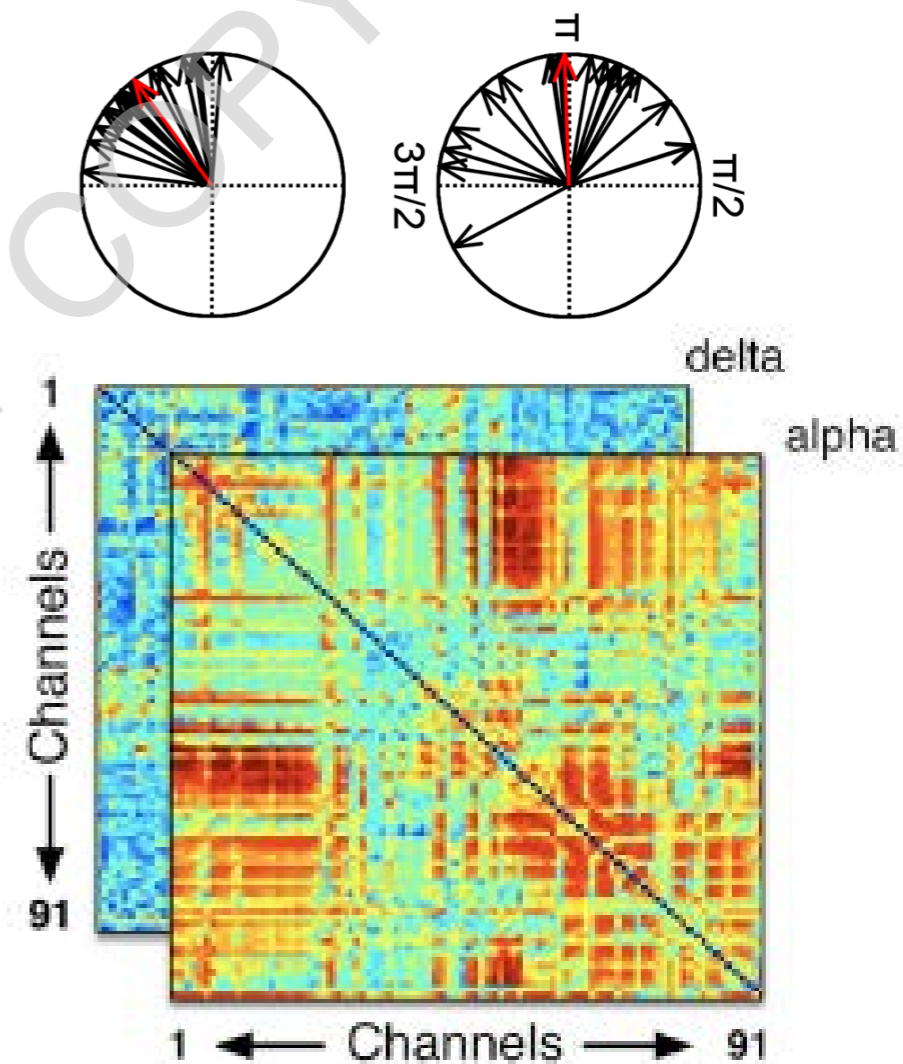
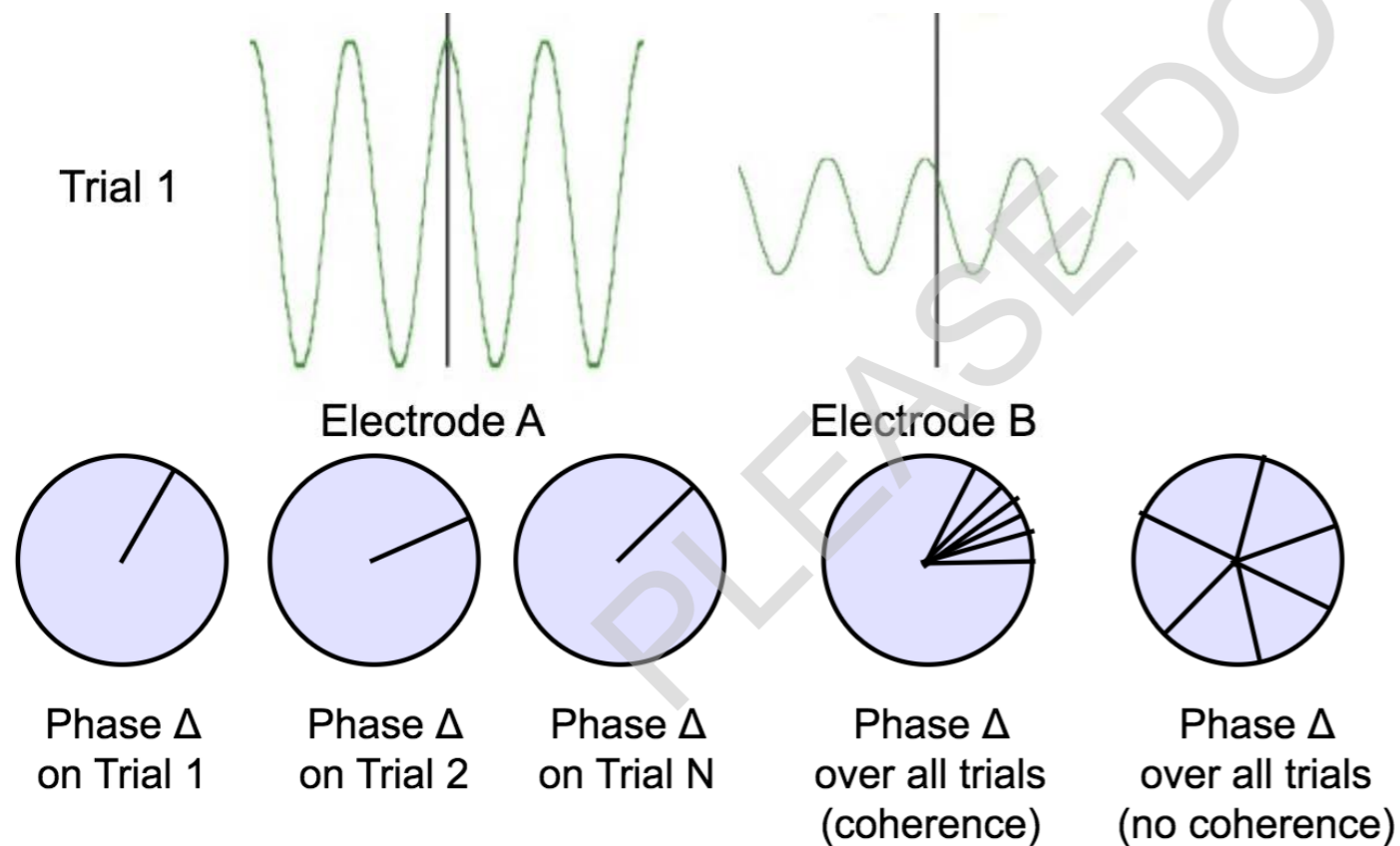
Time-Frequency Domain Analysis (EEG)



Connectivity Analysis (EEG)

Connectivity based on...

- .Phase (eg. phase-slope index)
- .Power (eg. coherence)
- .Cross-frequency coupling



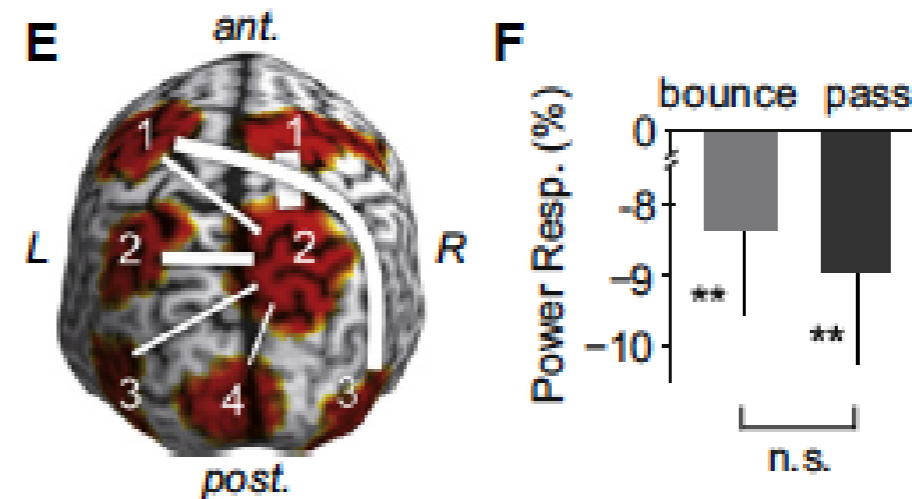
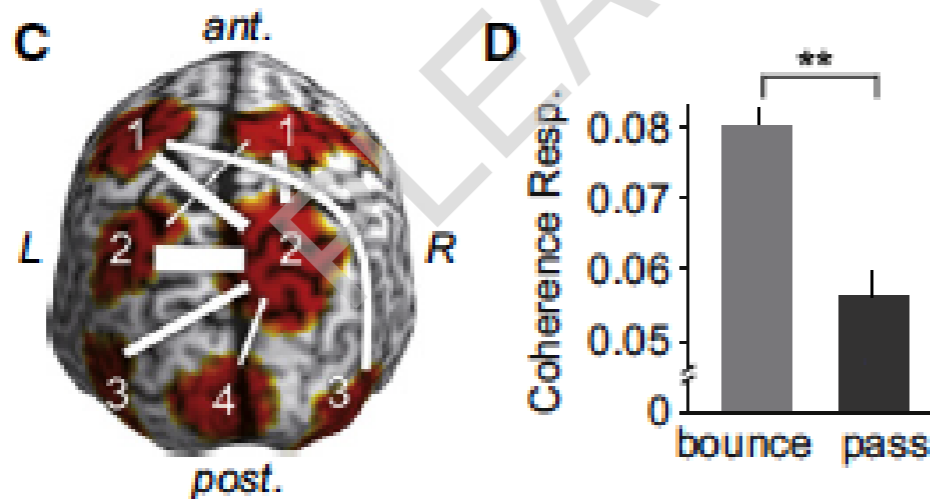
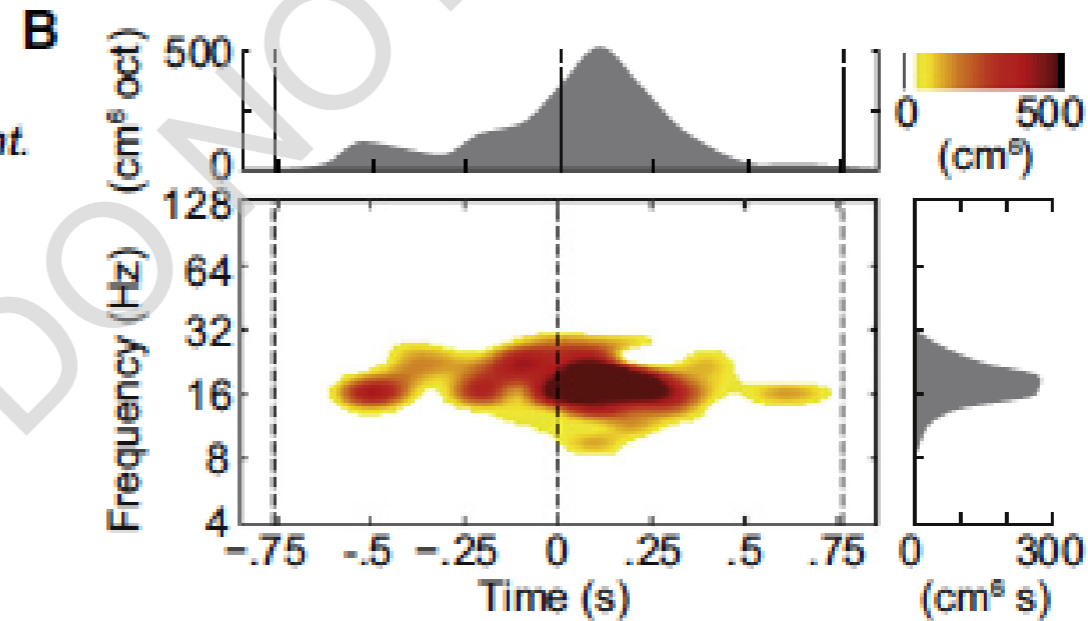
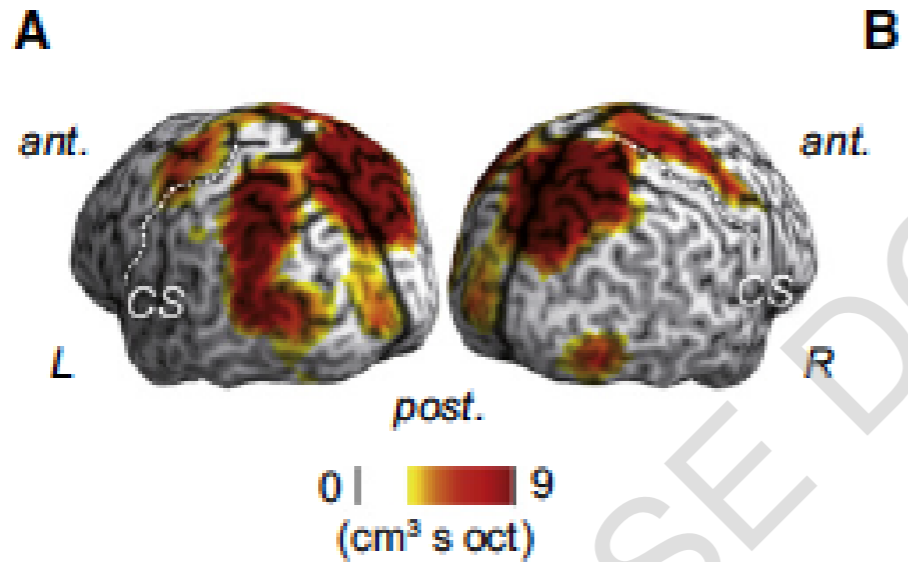
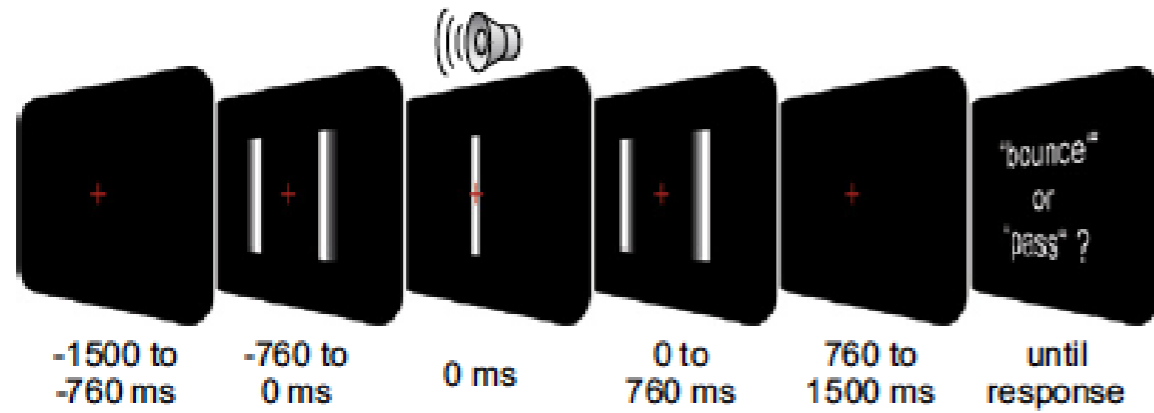
Topoplot:
100-300 ms
10-15 Hz

Connectivity Analysis (EEG)

ambiguous audiovisual stimulus:

two bars approached, briefly overlapped while a click sound was played, and moved apart from each other

Hipp et al., 2013



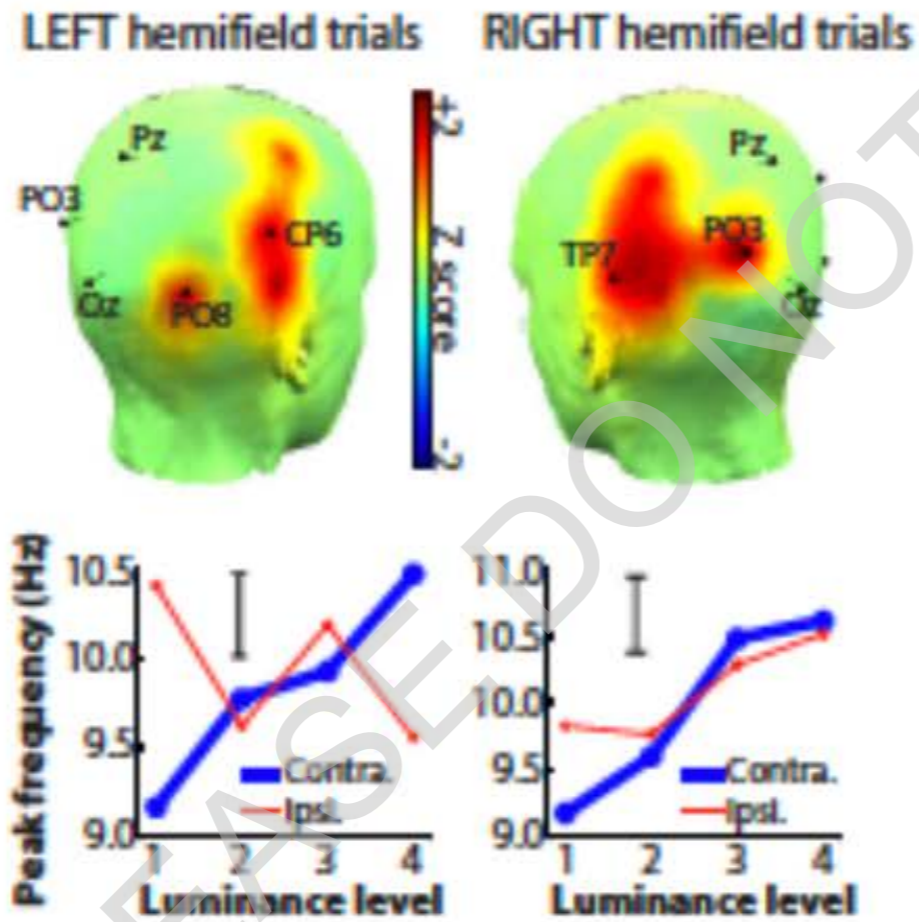
Connectivity Analysis (EEG)

Cohen et al., 2013

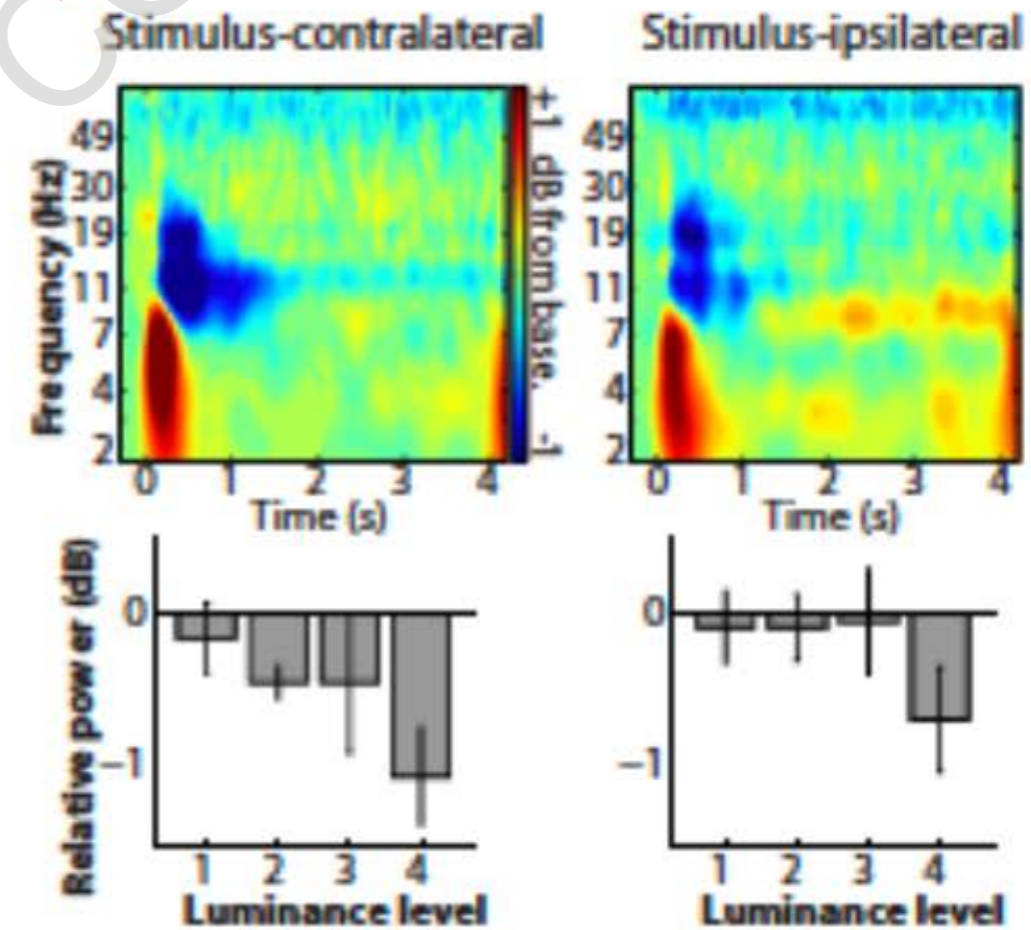
A



B

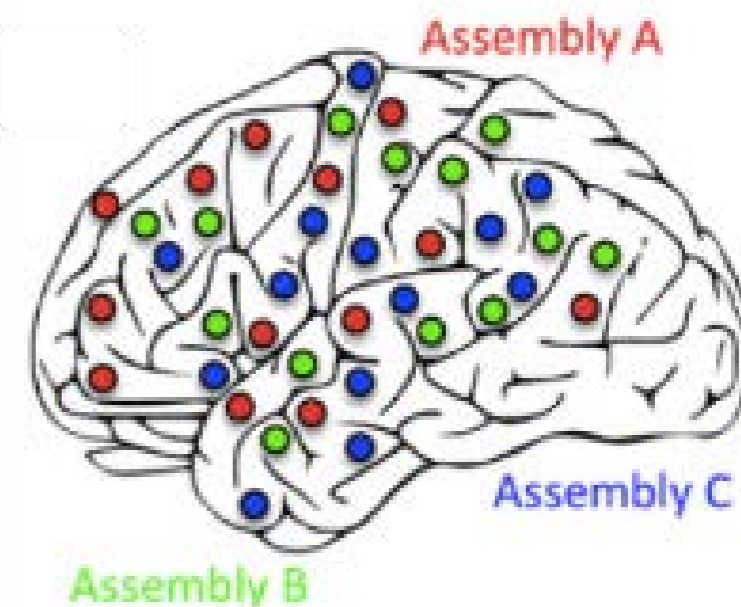


C



Advantages of tCS + EEG

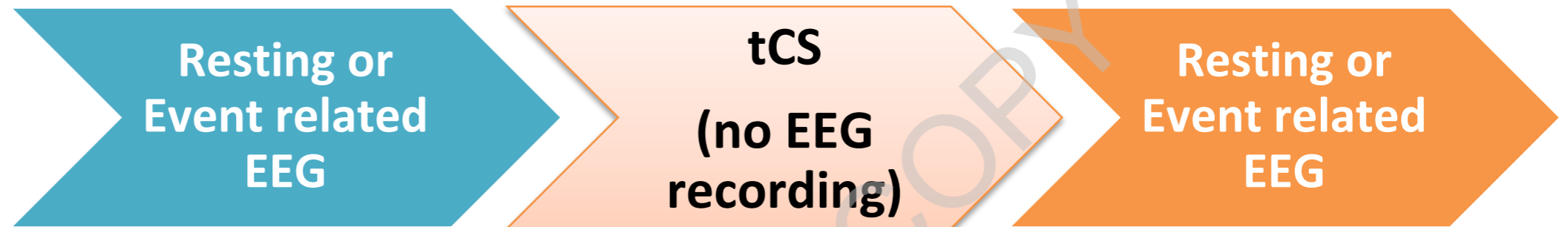
- Understanding the role of brain oscillations in both motor and non-motor regions, in both the healthy and pathological brain
- Measure both local and distant effects.
- Guide tCS intervention on the basis of and online/offline monitoring of brain states.



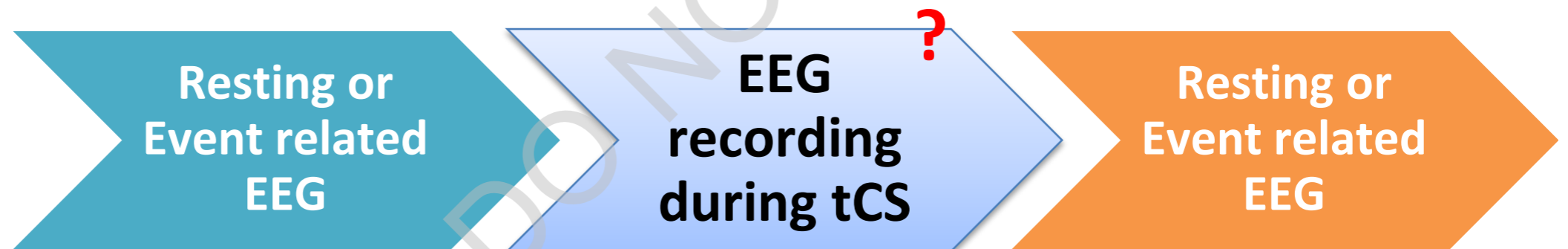
How can tCS + EEG be implemented?

tCS + EEG approaches

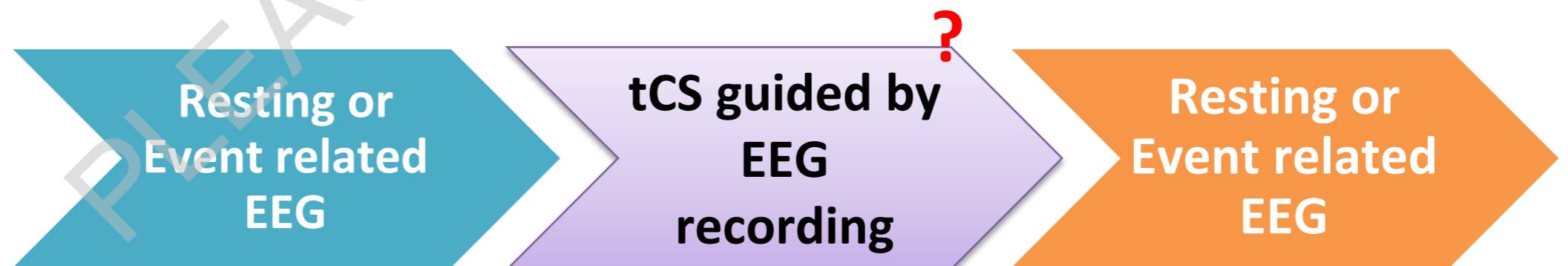
OFFLINE



ONLINE



**EEG-Guided,
closed-loop
system**



tCS and EEG: variables

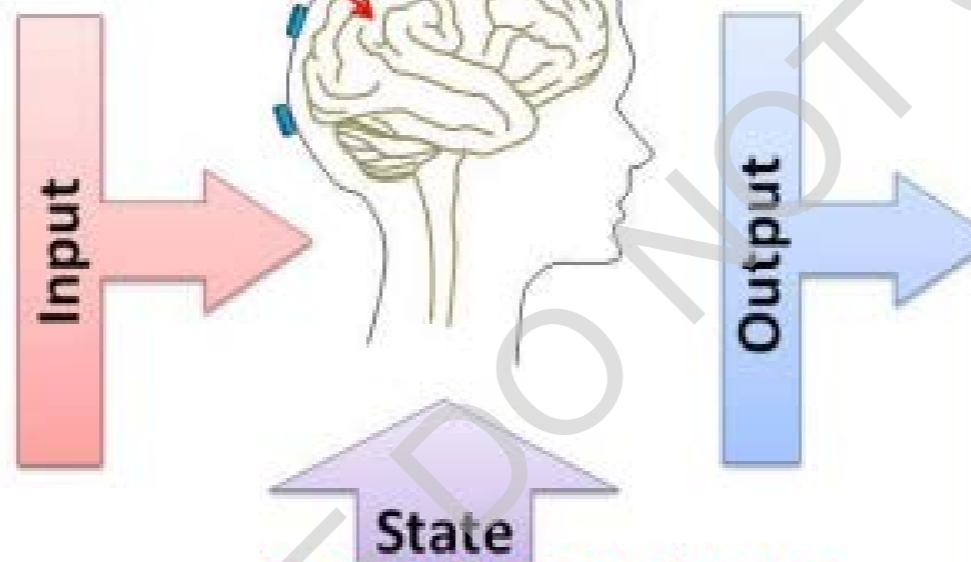
Choose Parameters

Input Location	
Anatomically guided	Scalp landmark Brain atlas MRI, DTI
Functionally guided	fMRI TMS EEG

tES Input Parameters	
Intensity	Standard Guided
Frequency	Standard EEG Guided

Input Time
Guided with respect to a brain state

Closed Loop



State Dependency

Controlled Brain State	
Developmental state	• Age
Behavioral state	• anesthesia, sleep • wakeful resting • passive/active sensory processing • motor movement • cognitive performance
Brain dynamics	• current and history of dynamics • a preceding stimulus
Disease state	• Disease duration, severity, etc • Intervention strategies

Local/Network Effects

Output Location

- Selected sensors or sources
- All sensors (topography)
- All sources (tomography)

EEG Output Measures

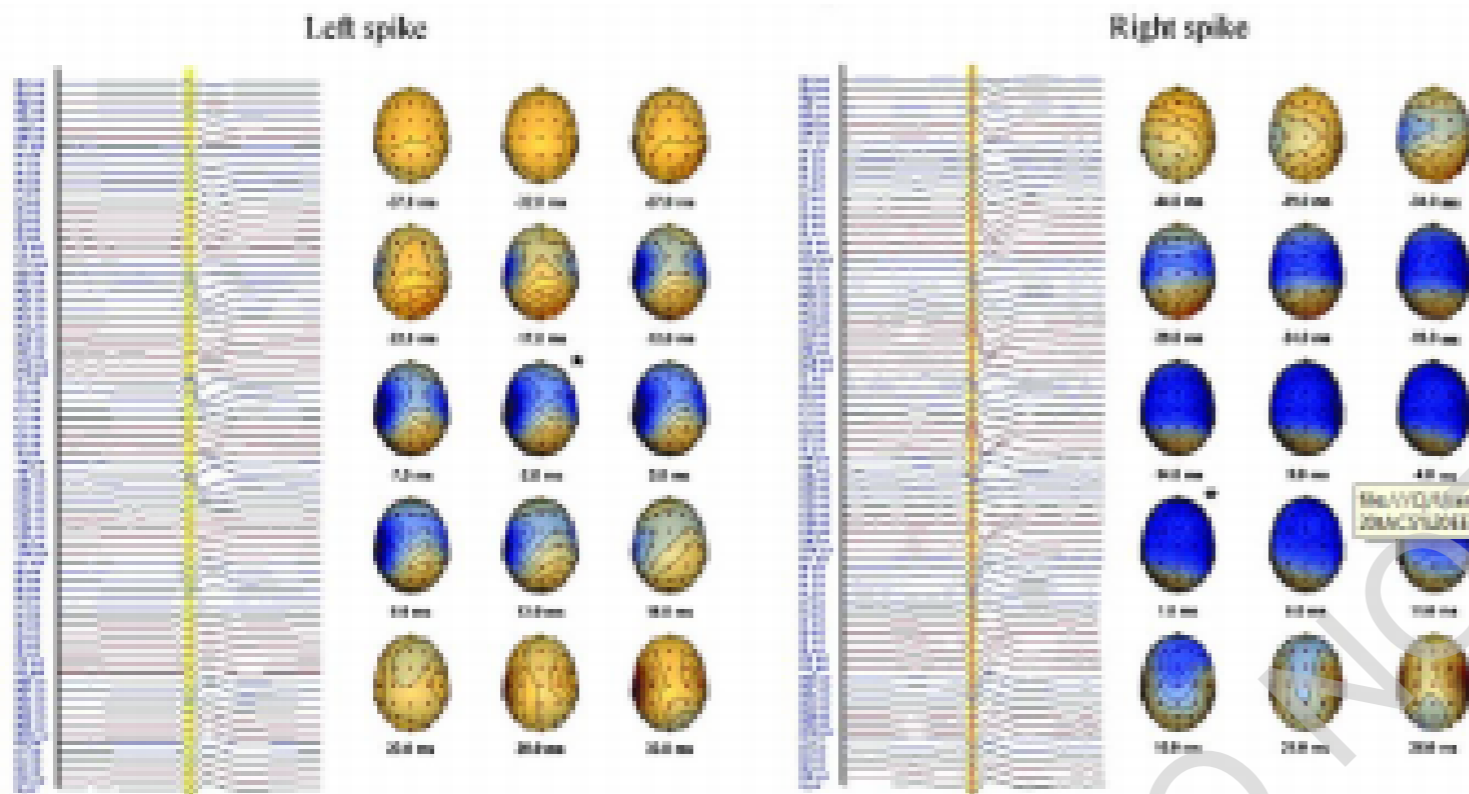
Analysis	Mechanisms
Amplitude e.g., ERP, GMFA	Local or global excitation/inhibition
Power of each frequency e.g., ERS/ERD	Local or global synchronization
Power as a function of time & frequency e.g., ERSP	Intrinsic properties e.g., Resonant frequency
• Correlation • Coherence • Synchrony • Phase-amplitude cross- frequency coupling	Functional connectivity e.g., Amplitude, frequency and phase coupling between two or more signals
• Directed-transfer function • Partial directed coherence	Directed functional connectivity e.g., Information flow

Output Time

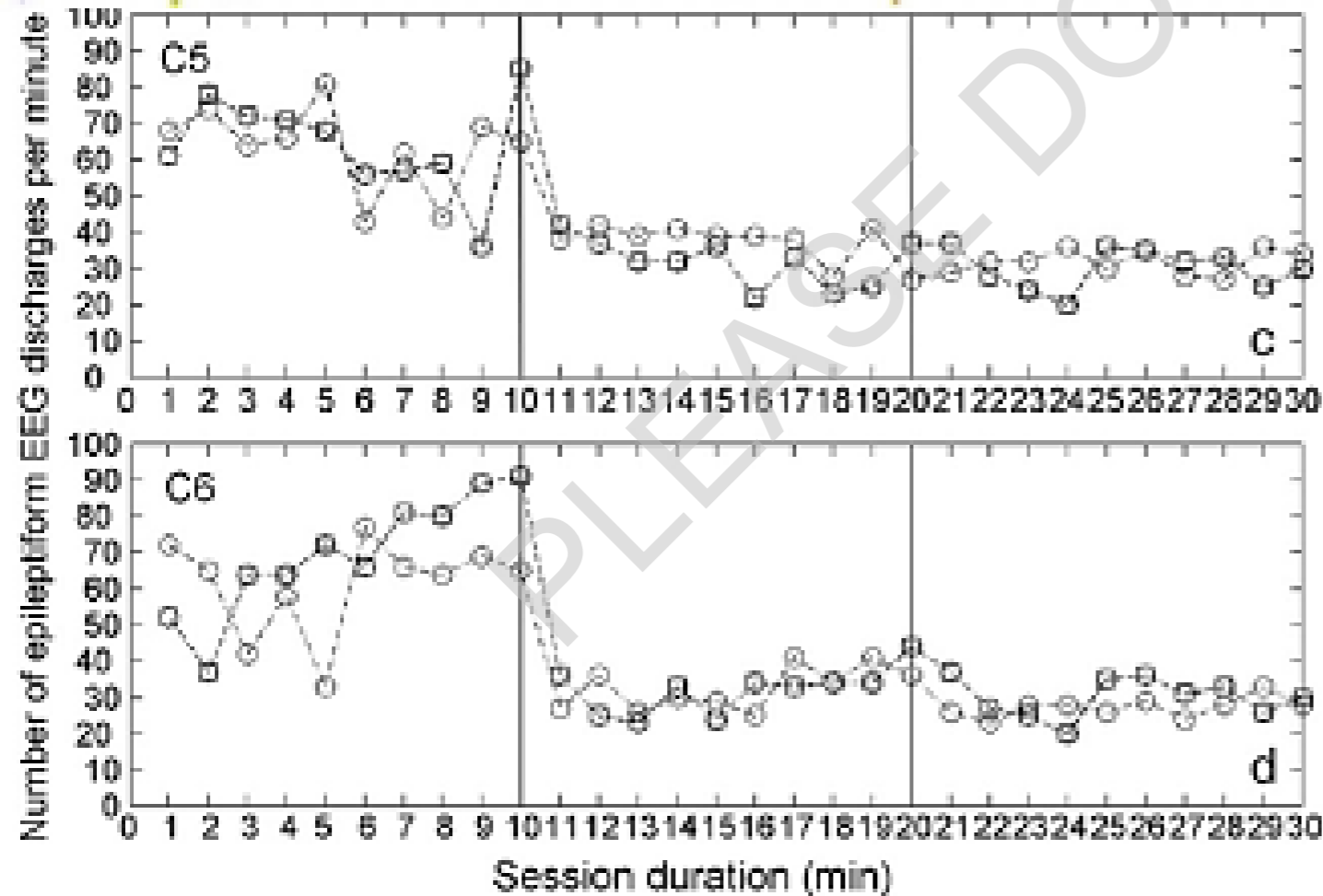
- Relative to input time
- Relative to a brain state

EEG-Guided tCS: Location

Faria et al., 2012



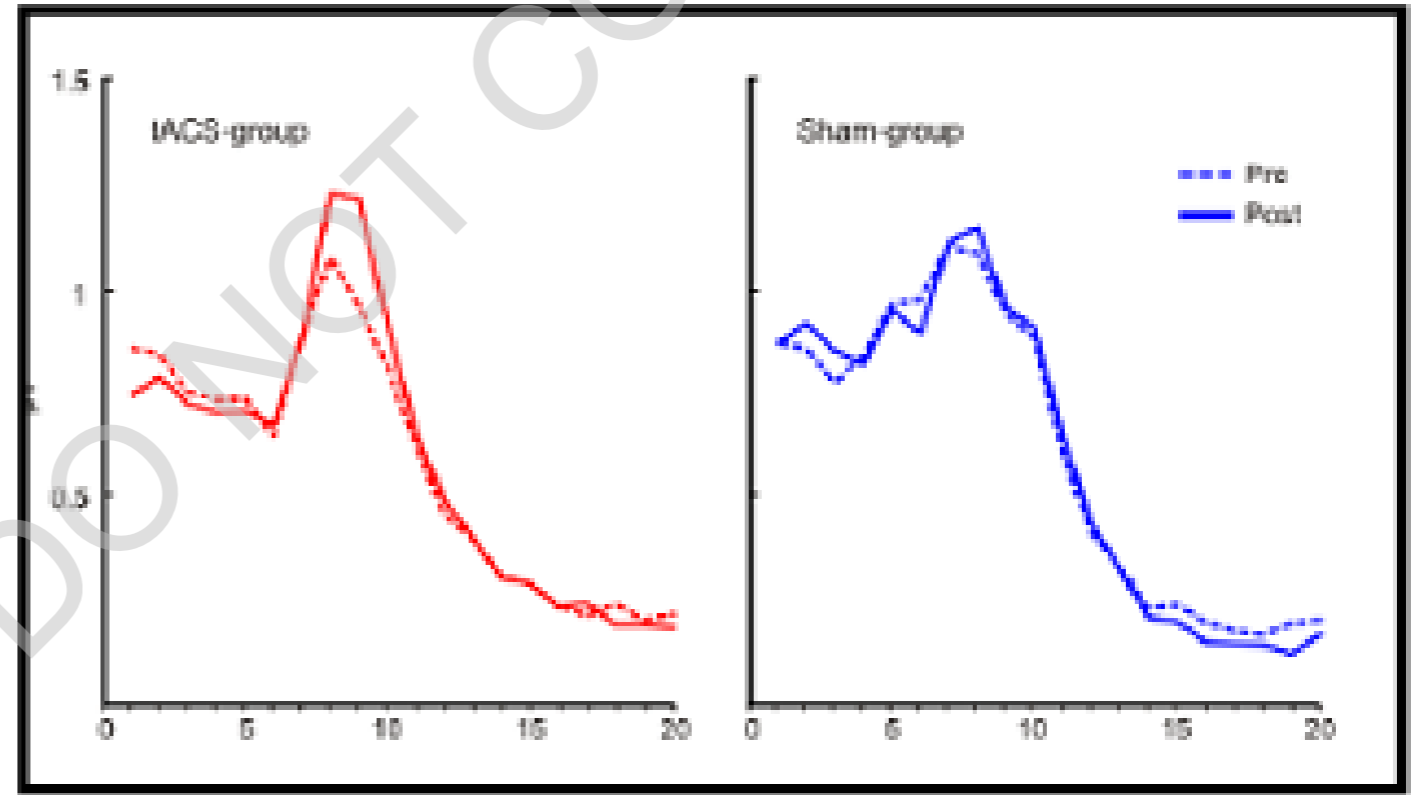
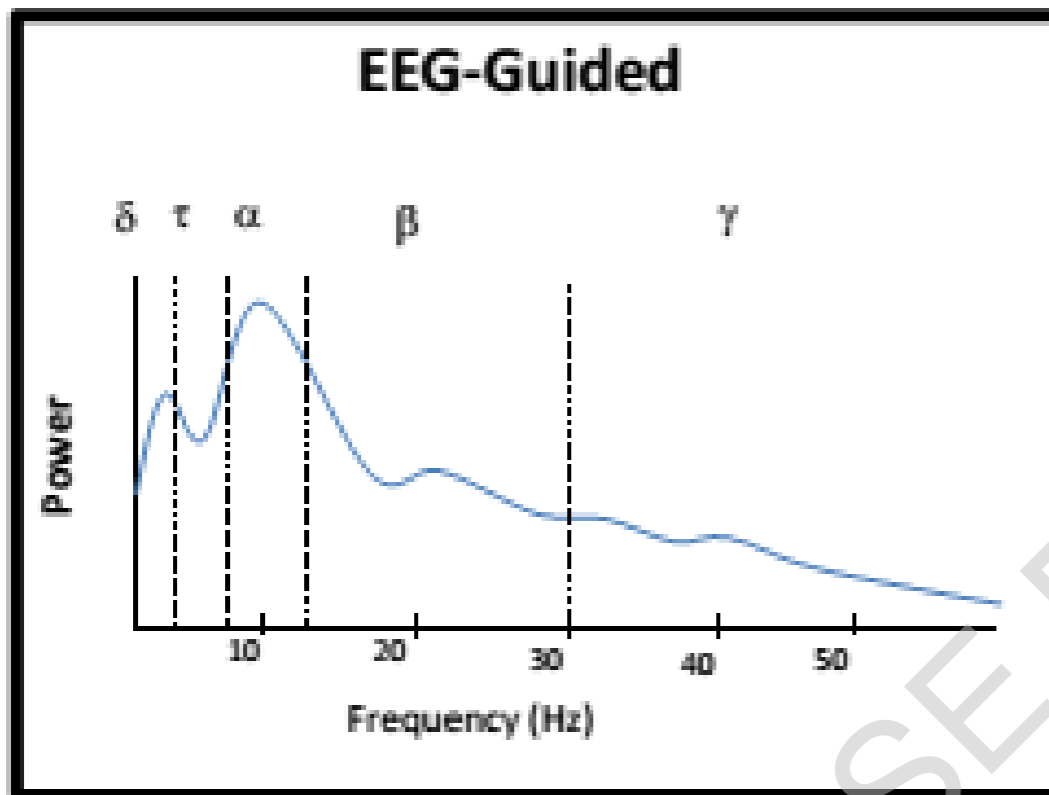
EEG evaluation of a patient with **Continuous spike-wave discharges** during slow-wave sleep allowed identification of an **epileptogenic focus**.



↓
Cathodal tDCS over the focus resulted in a significant decrease in interictal spikes.

Frequency

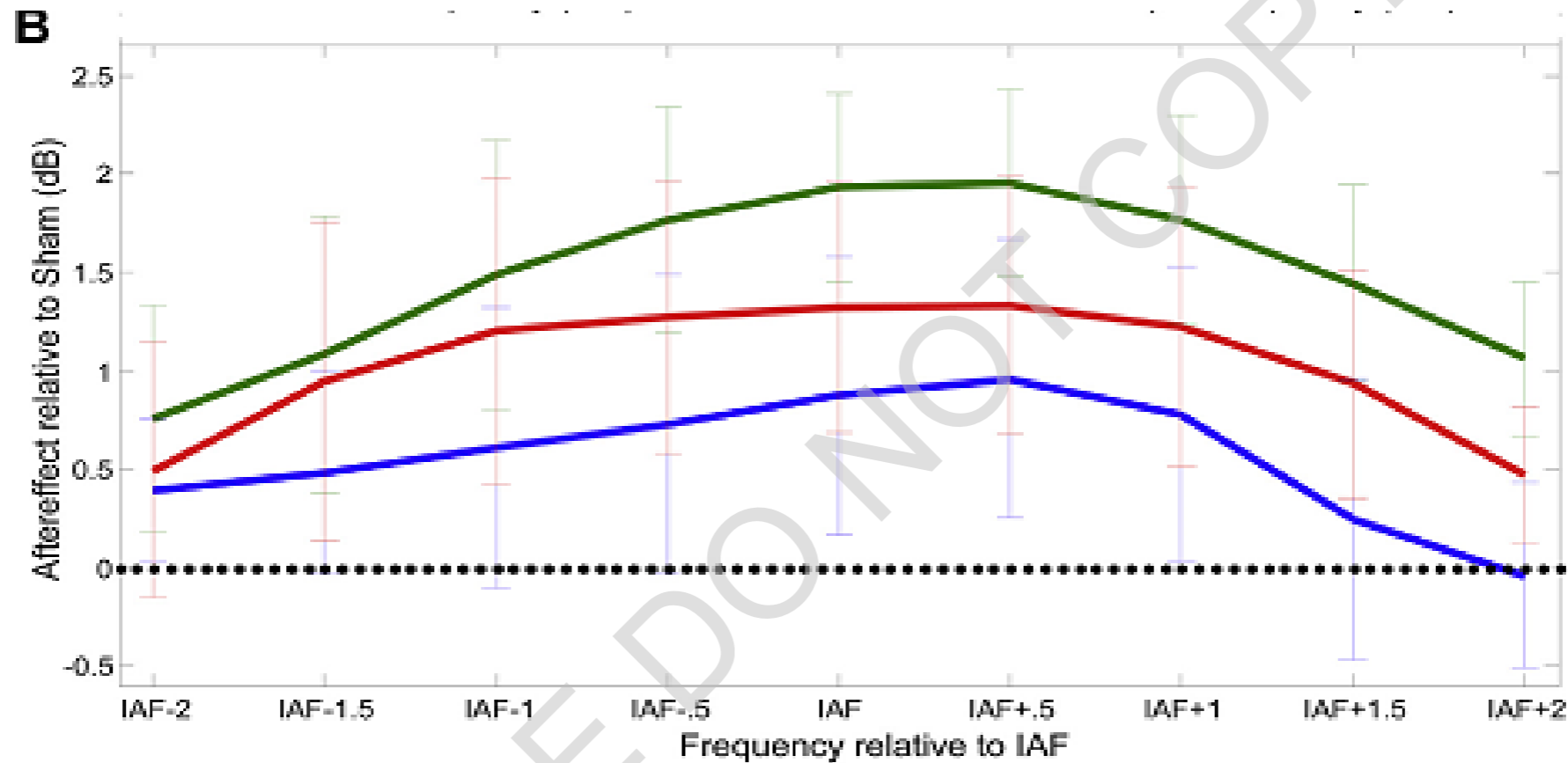
Individual Alpha frequency



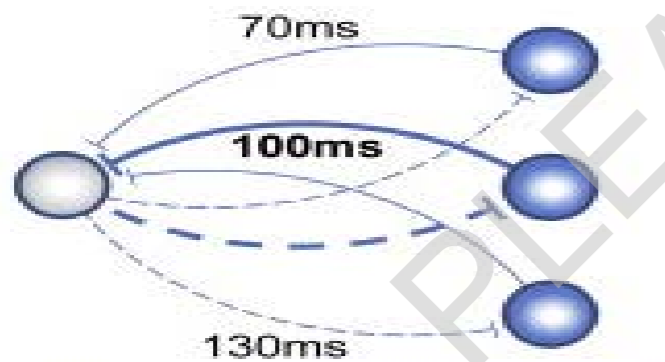
- **tACS** on the occipital cortex at individual alpha frequency
- **Resting EEG** → increase in alpha in parieto-central electrodes, no effects on surrounding frequencies

Frequency

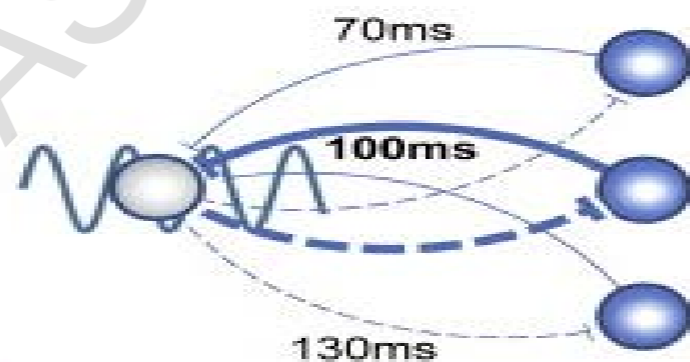
Individual Alpha frequency



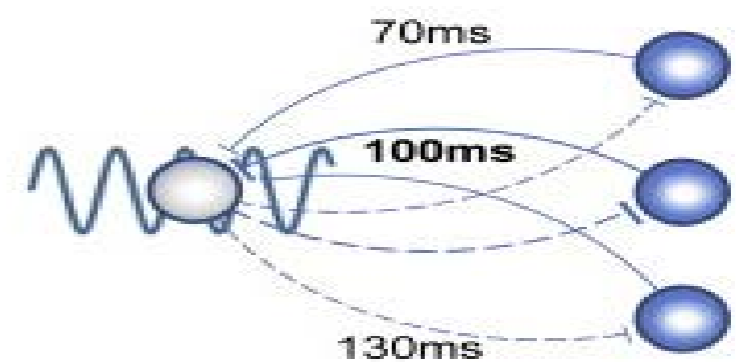
A



B tACS < IAF



C tACS > IAF



Neuling et al., 2012

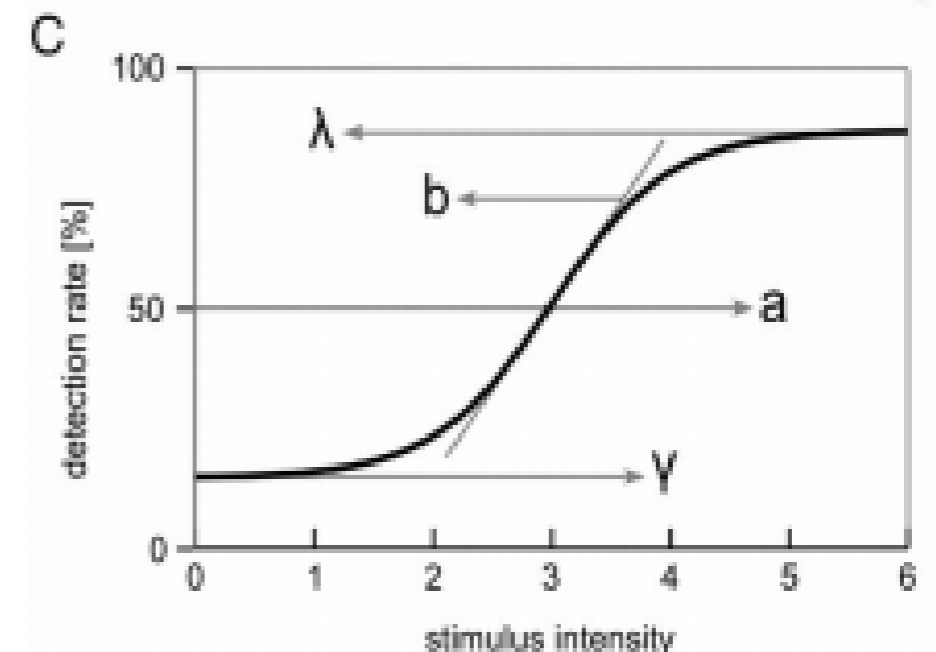
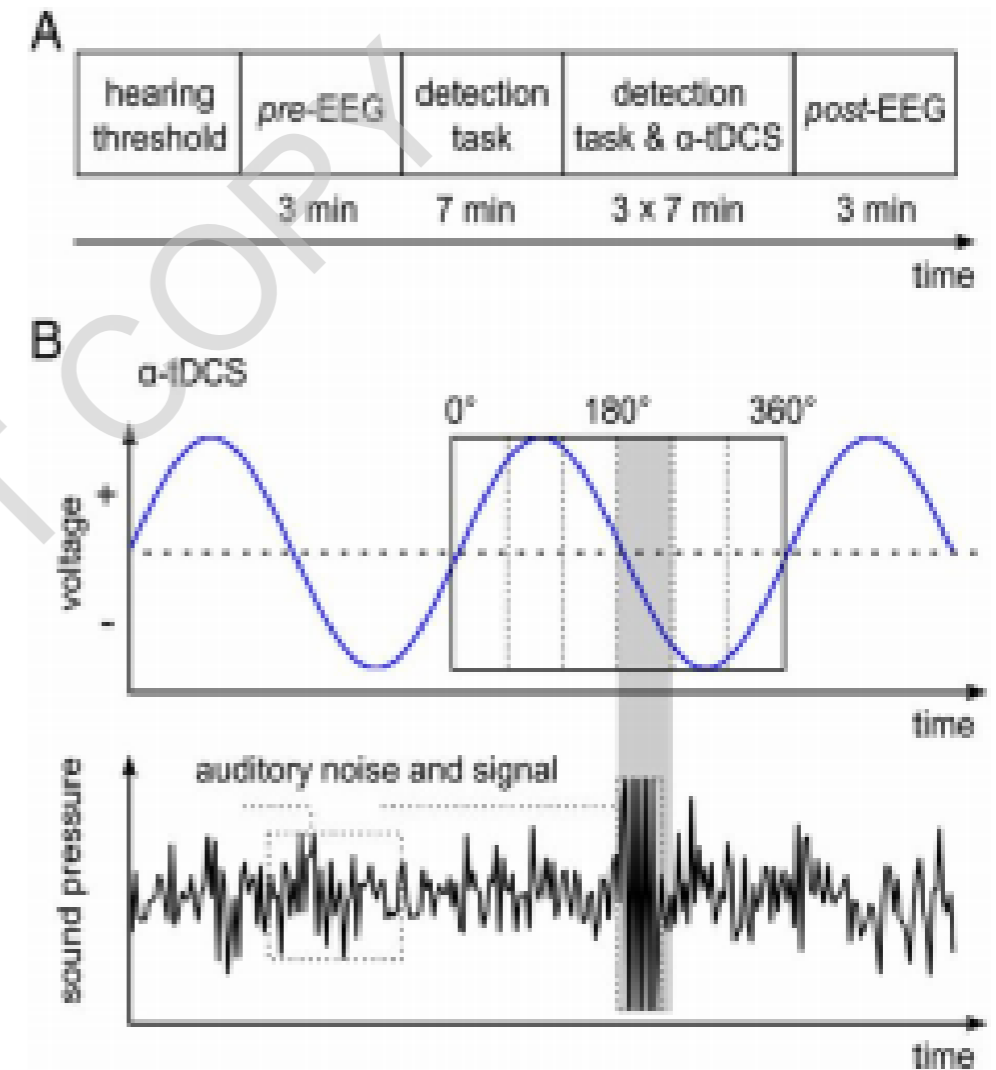
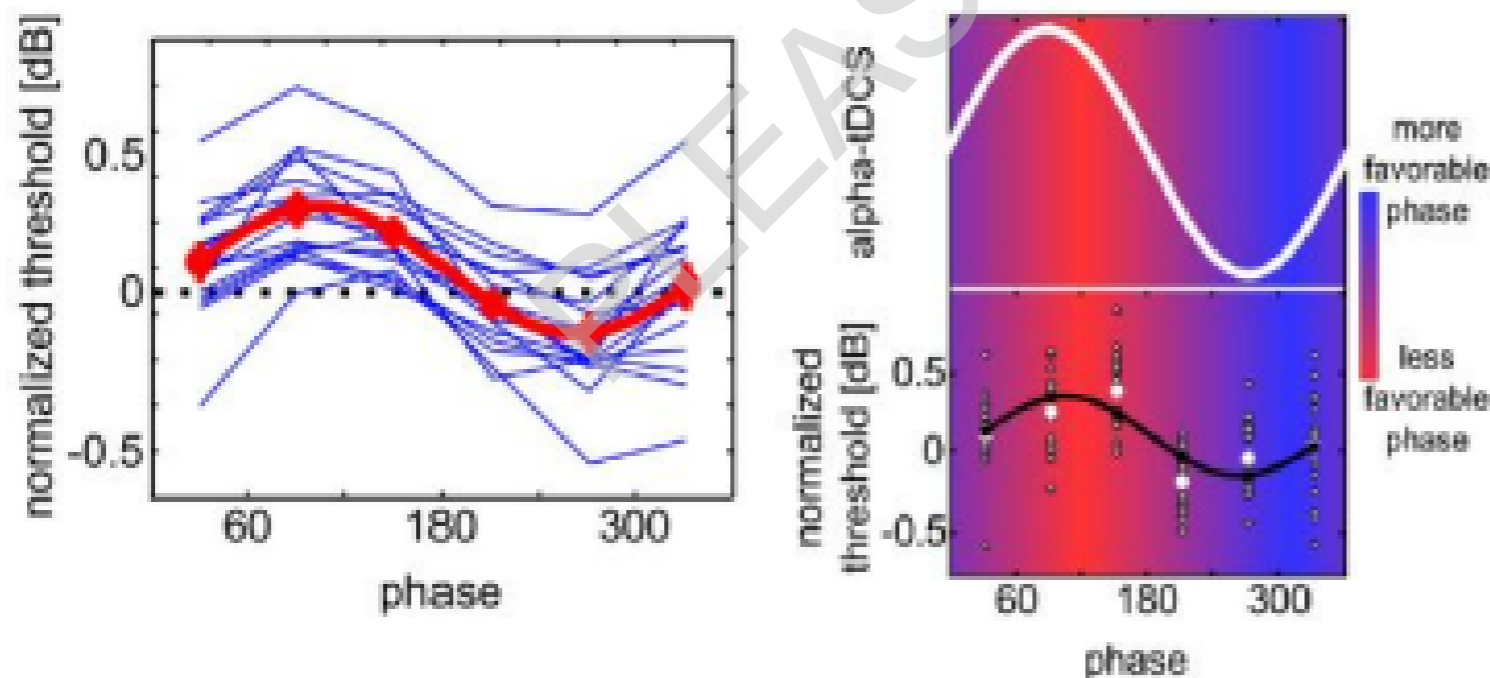
Phase

Causal relationship between phase and perception

Neuling et al., 2012: Used alpha-tDCS, the timing of the stimuli was arranged relative to the α -tDCS to present the stimuli in specific phase bins.

Perception: Detection thresholds were dependent on the phase of oscillation entrained by alpha tDCS.

EEG rest: Alpha power was enhanced after alpha tDCS



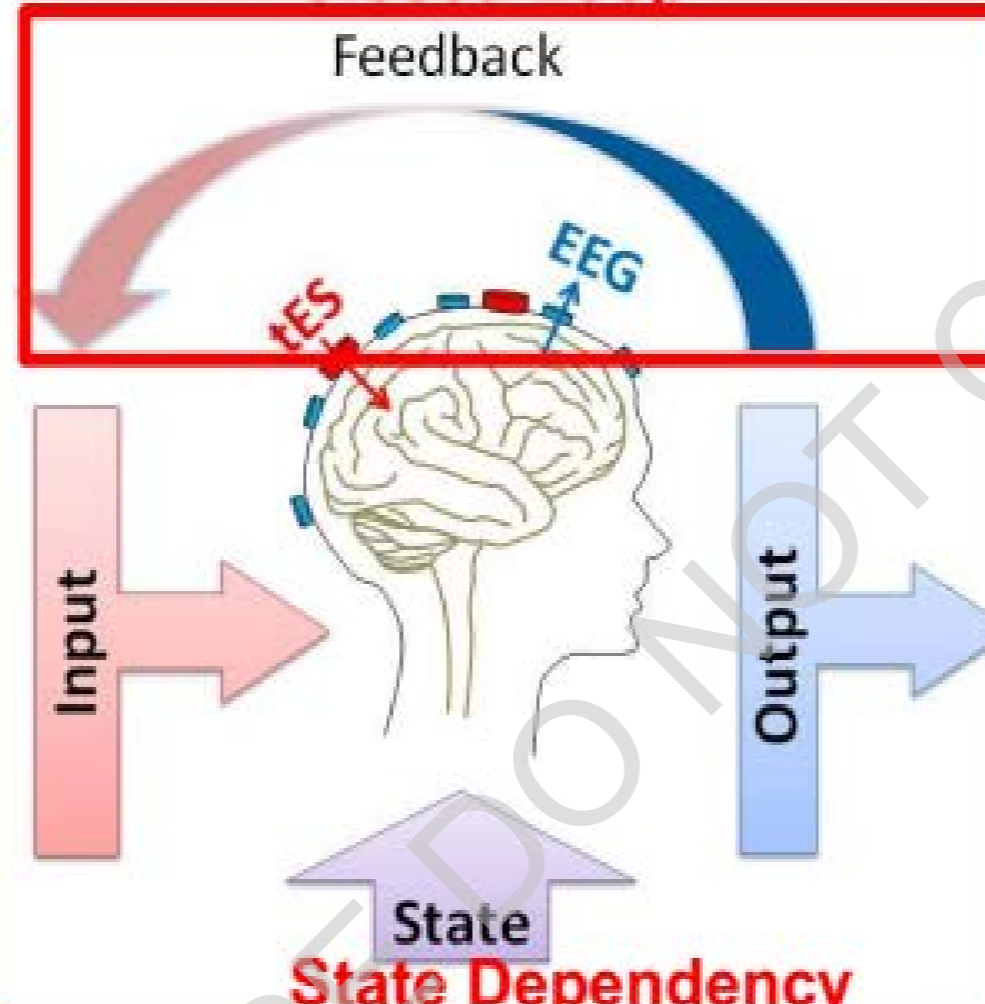
Choose Parameters

Input Location	
Anatomically guided	Scalp landmark Brain atlas MRI, DTI
Functionally guided	fMRI TMS EEG

tES Input Parameters	
Intensity	Standard Guided
Frequency	Standard EEG Guided

Input Time
Guided with respect to a brain state

Closed Loop



State Dependency

Controlled Brain State	
Developmental state	<ul style="list-style-type: none"> • Age
Behavioral state	<ul style="list-style-type: none"> • anesthesia, sleep • wakeful resting • passive/active sensory processing • motor movement • cognitive performance
Brain dynamics	<ul style="list-style-type: none"> • current and history of dynamics • a preceding stimulus
Disease state	<ul style="list-style-type: none"> • Disease duration, severity, etc • Intervention strategies

Local/Network Effects

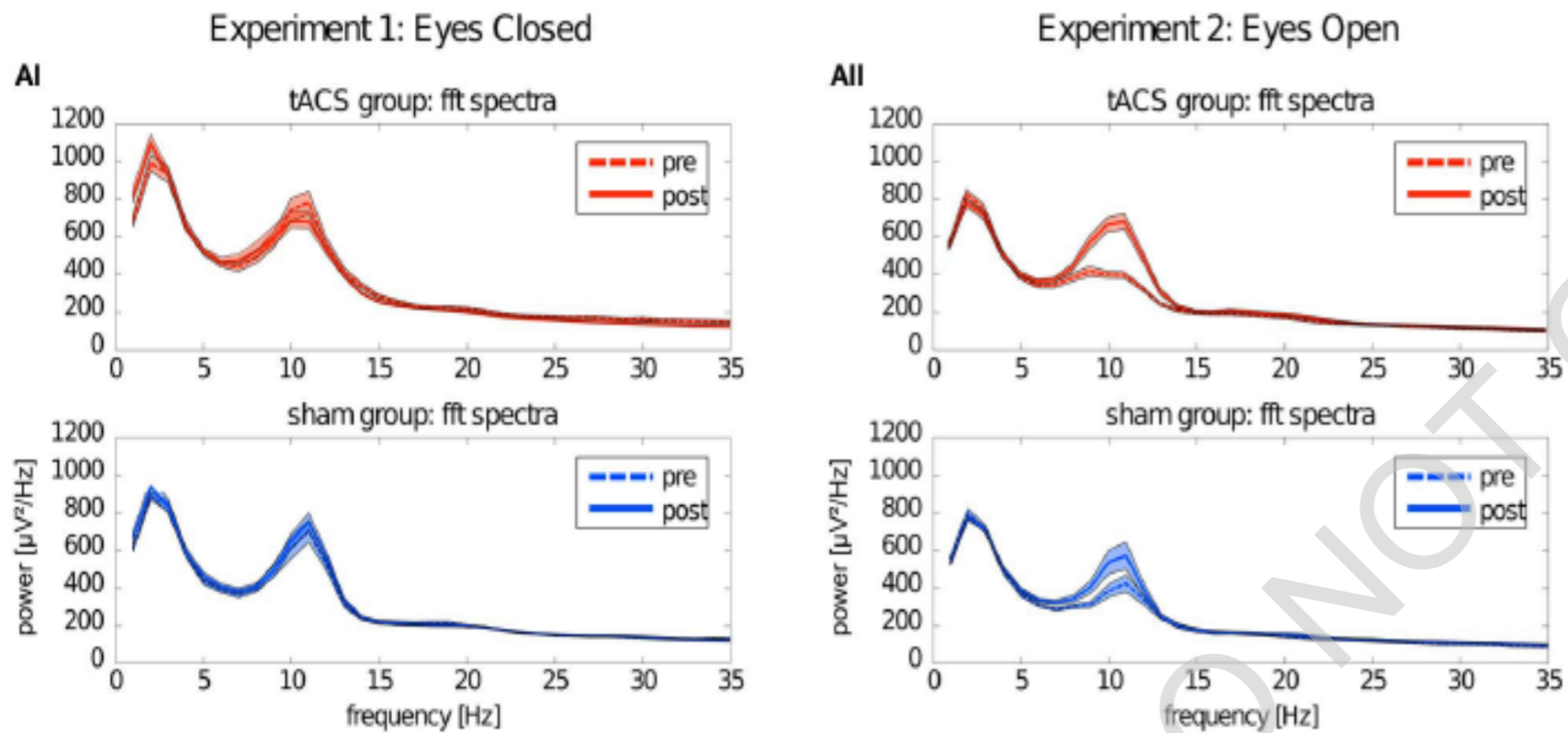
Output Location	
<ul style="list-style-type: none"> • Selected sensors or sources • All sensors (topography) • All sources (tomography) 	

EEG Output Measures	
Analysis	Mechanisms
Amplitude e.g., ERP, GMFA	Local or global excitation/inhibition
Power of each frequency e.g., ERS/ERD	Local or global synchronization
Power as a function of time & frequency e.g., ERSP	Intrinsic properties e.g., Resonant frequency
<ul style="list-style-type: none"> • Correlation • Coherence • Synchrony • Phase-amplitude cross-frequency coupling 	Functional connectivity e.g., Amplitude, frequency and phase coupling between two or more signals
<ul style="list-style-type: none"> • Directed-transfer function • Partial directed coherence 	Directed functional connectivity e.g., Information flow

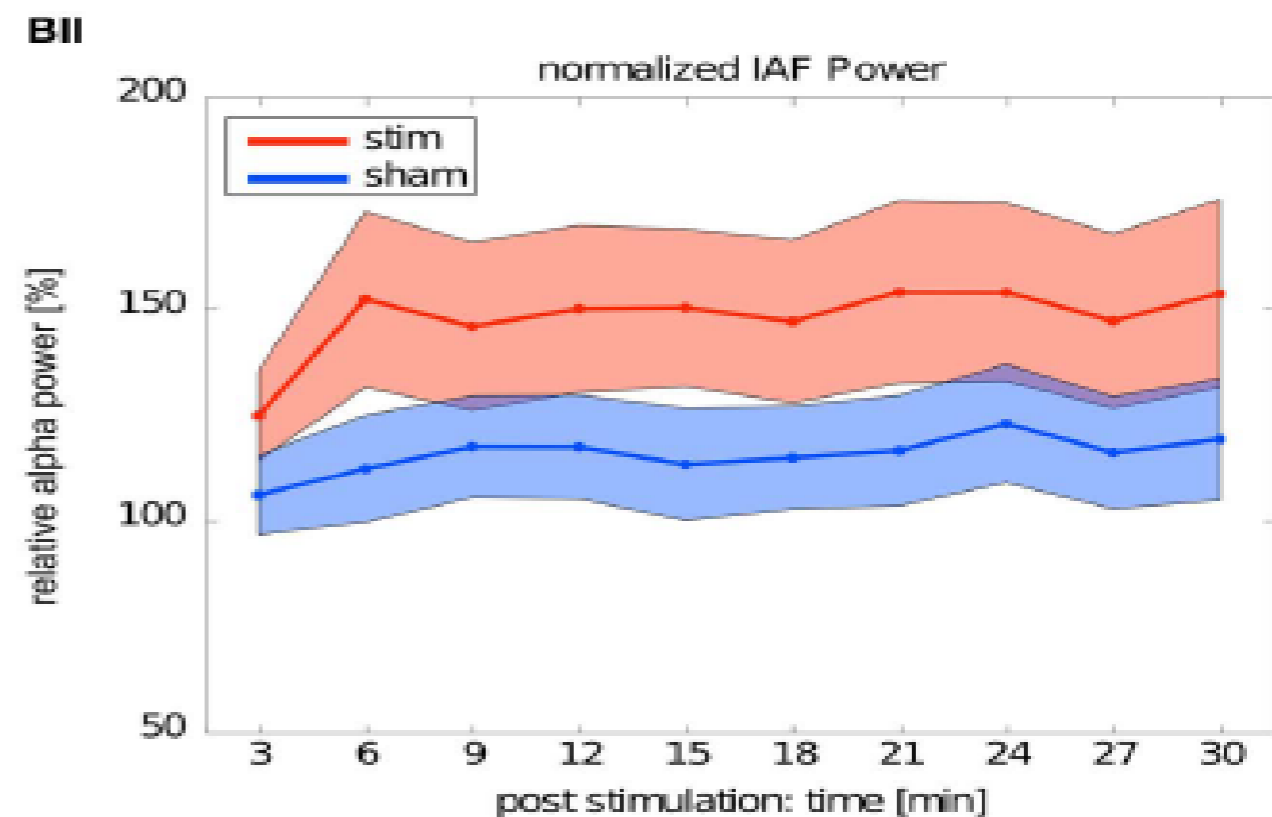
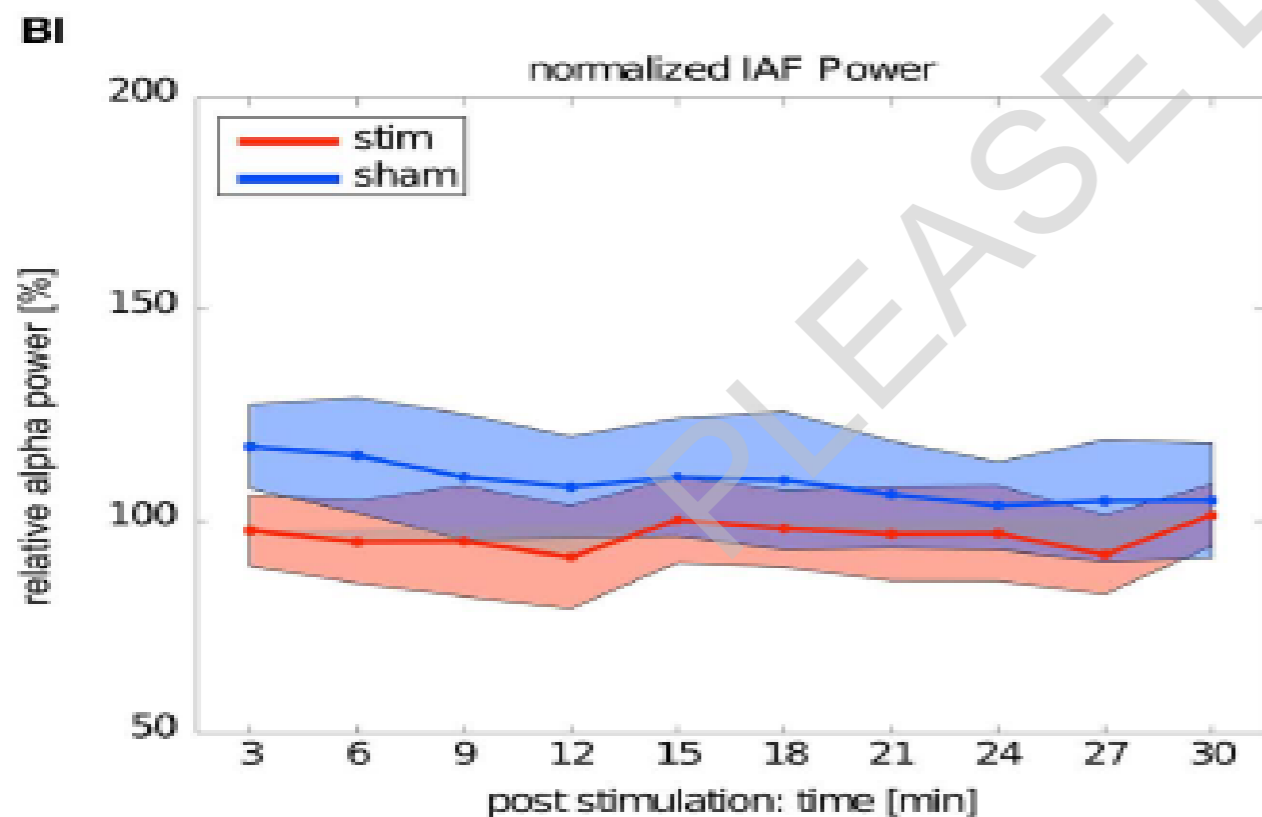
Output Time
<ul style="list-style-type: none"> • Relative to input time • Relative to a brain state

State dependency: Eyes Open vs. Eyes Closed

Neuling et al., 2013



Significant increase in alpha-power
after individual-alpha frequency tACS
when applied with **Eyes open**, but not
with **Eyes closed**.

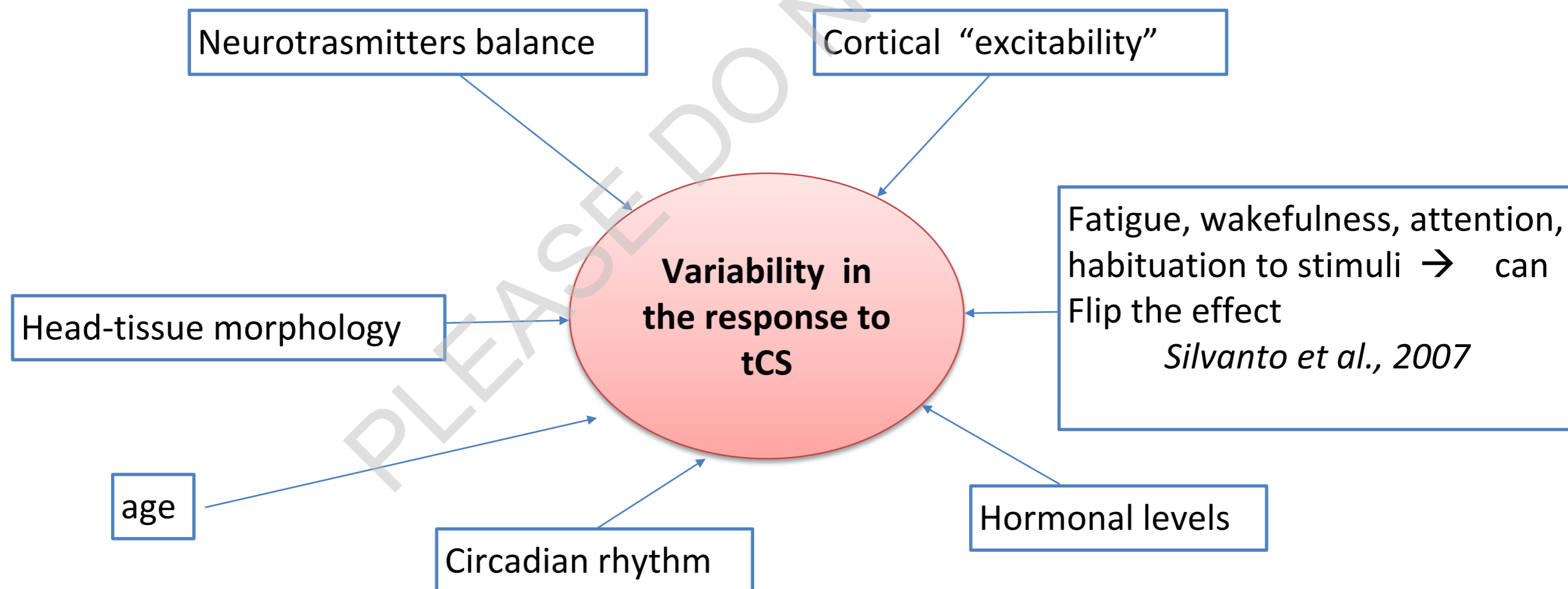




Not all brains are created equal: the relevance of individual differences in responsiveness to transcranial electrical stimulation

Beatrix Krause* and Roi Cohen Kadosh

Department of Experimental Psychology, University of Oxford, Oxford, UK



Choose Parameters

Input Location	
Anatomically guided	Scalp landmark Brain atlas MRI, DTI
Functionally guided	fMRI TMS EEG

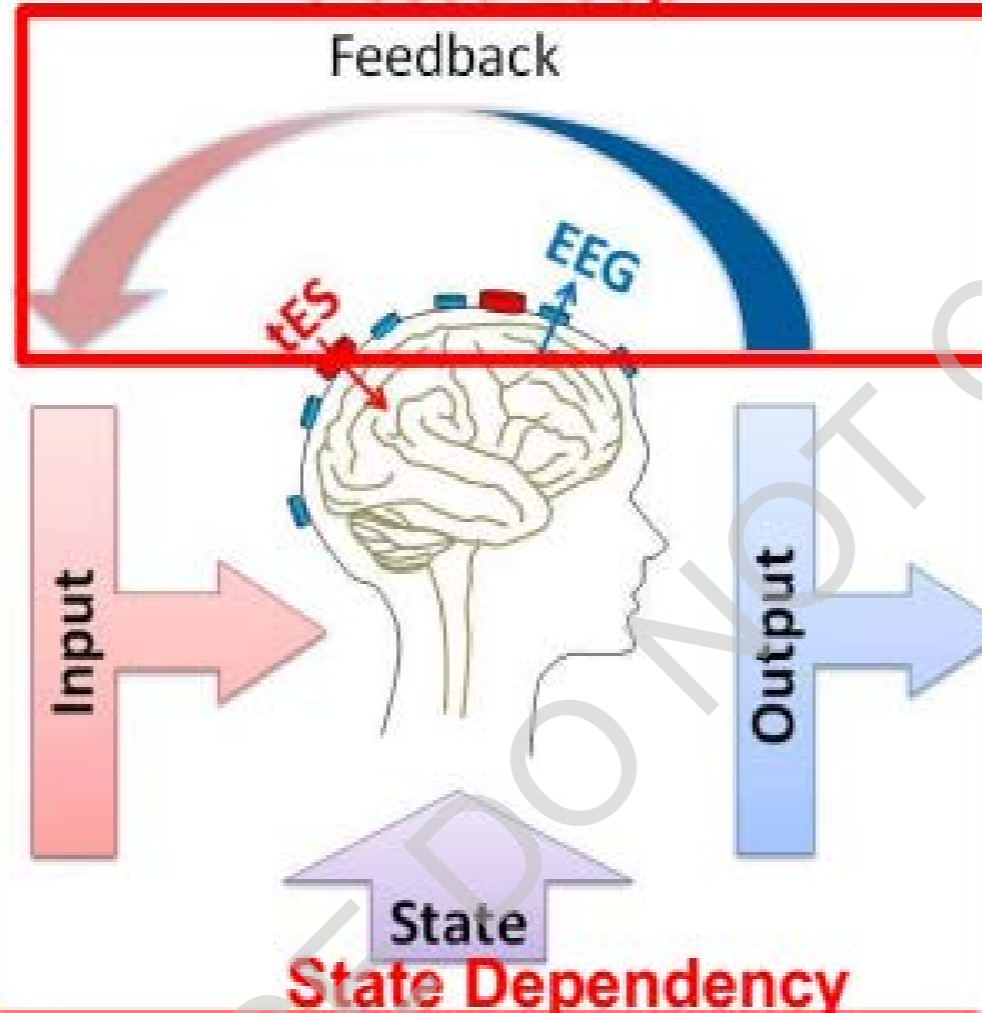
tES Input Parameters

Intensity	Standard Guided
Frequency	Standard EEG Guided

Input Time

Guided with respect to a brain state

Closed Loop



State Dependency

Controlled Brain State

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Local/Network Effects

Output Location

- Selected sensors or sources
- All sensors (topography)
- All sources (tomography)

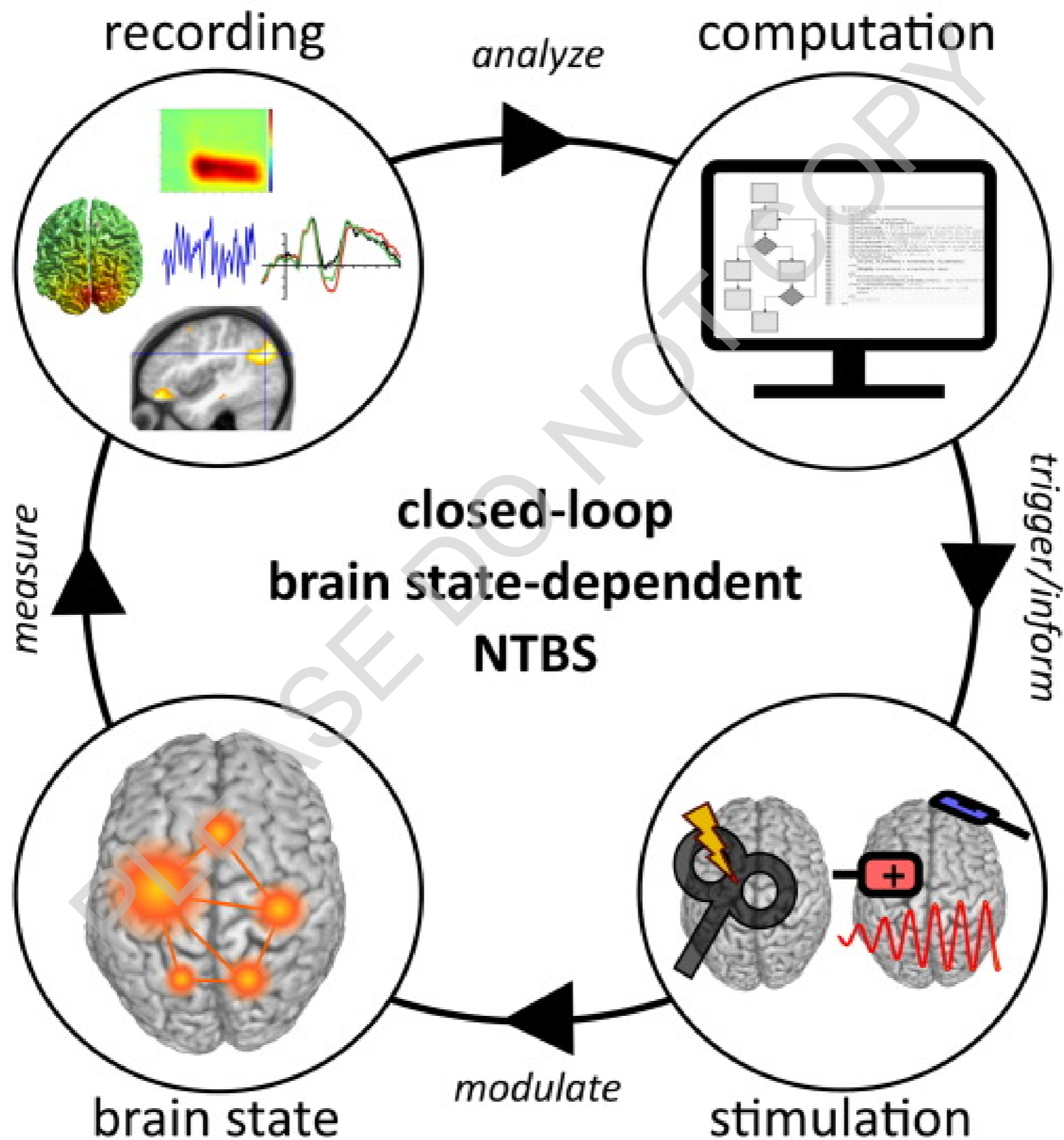
EEG Output Measures

Analysis	Mechanisms
Amplitude e.g., ERP, GMFA	Local or global excitation/inhibition
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<ul style="list-style-type: none"> • Directed-transfer function • Partial directed coherence 	Directed functional connectivity e.g., Information flow

Output Time

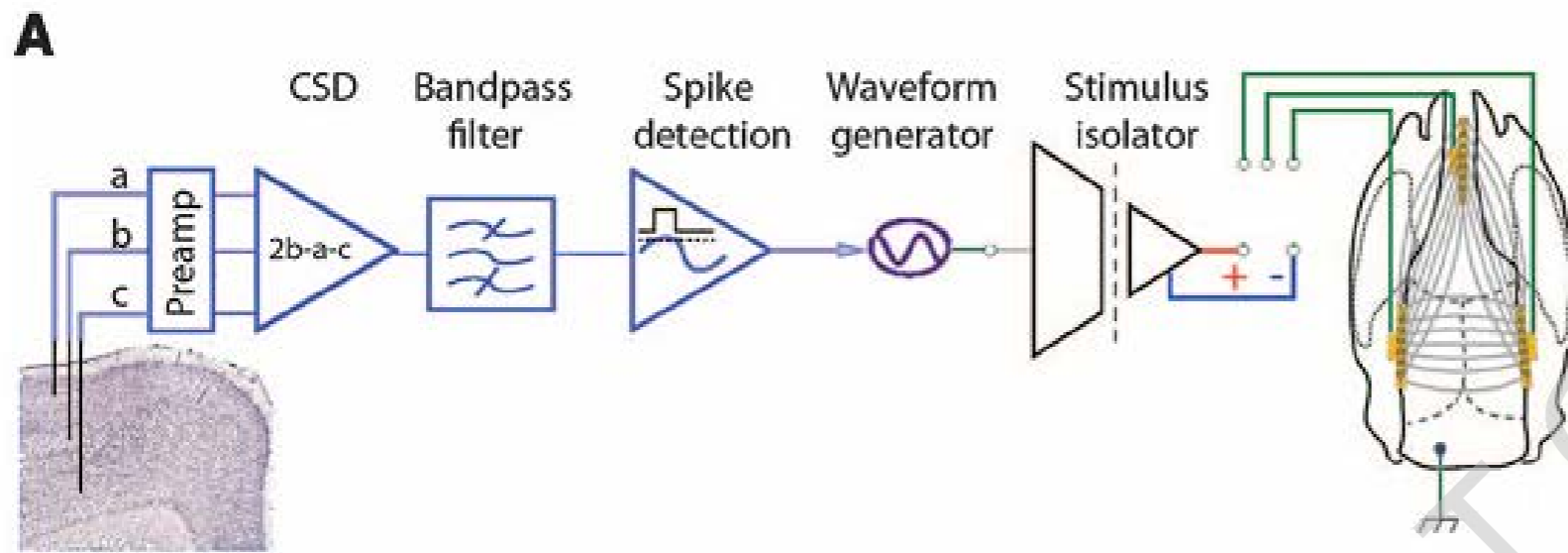
- Relative to input time
- Relative to a brain state

Closed-Loop Diagram

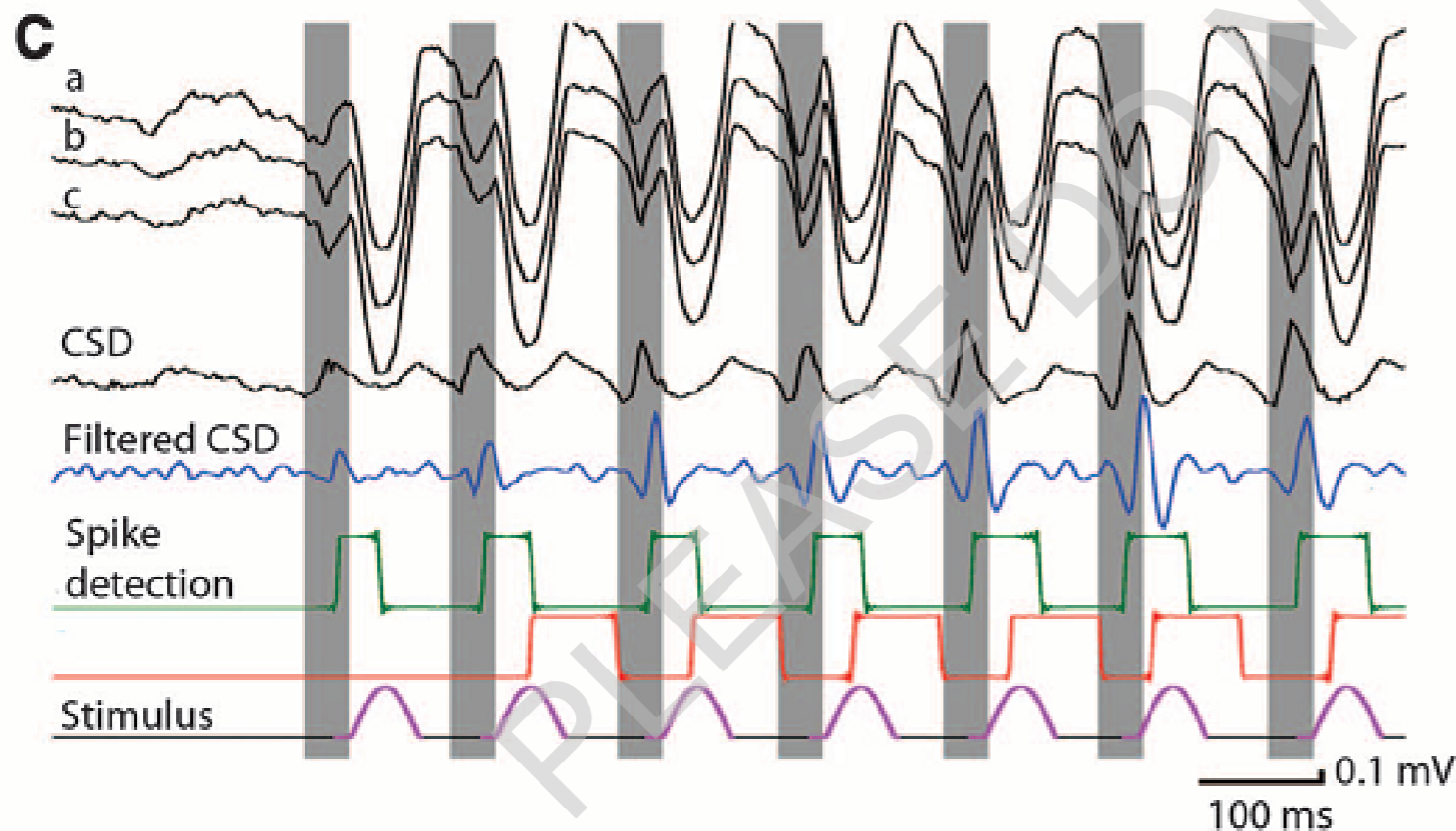


Closed-Loop Studies in Animal

Berenyi et al., 2012



- Rodent model of generalized epilepsy.
- Detection of interictal spikes triggers tCS at 1Hz

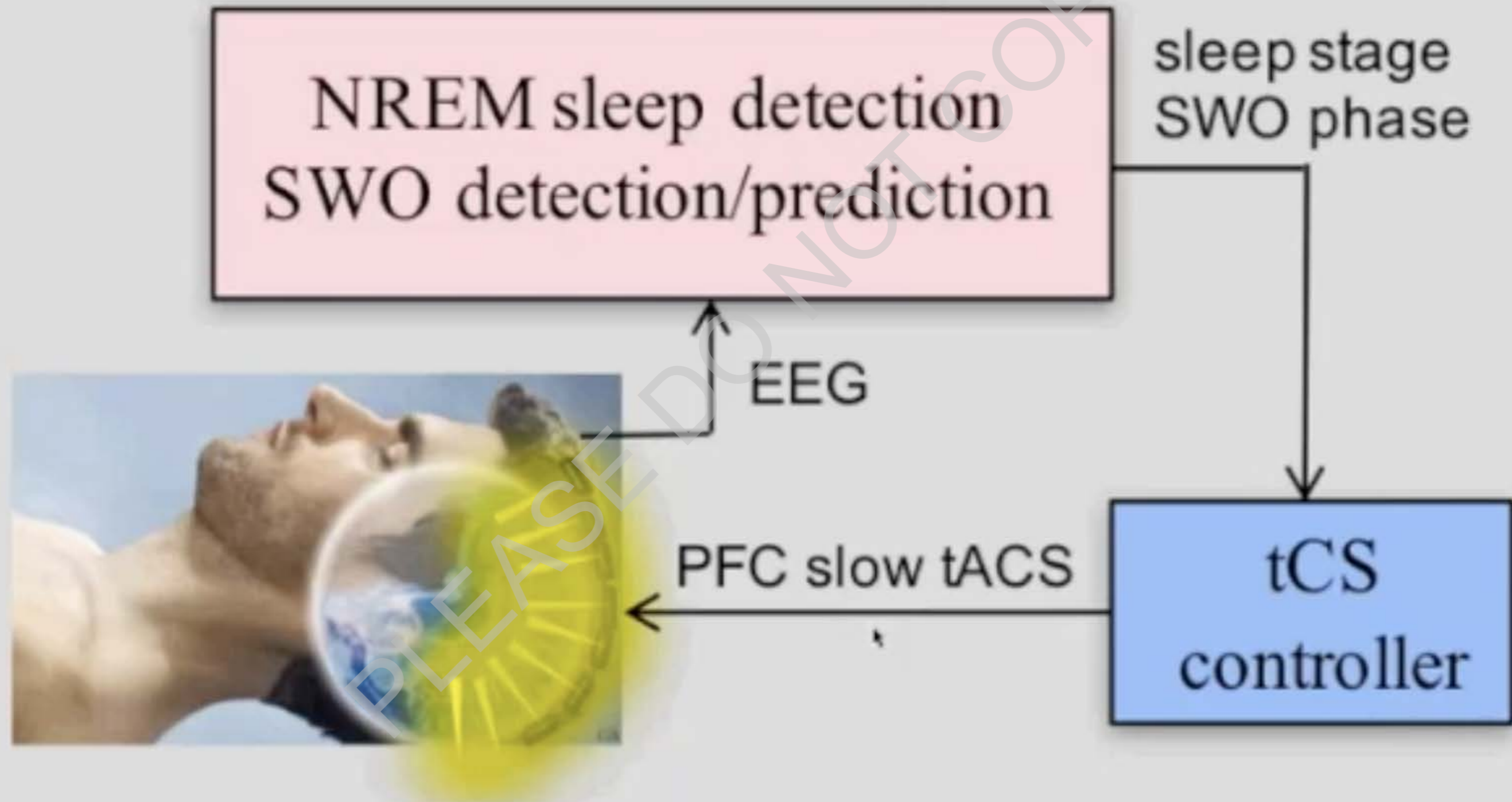


↓

Aborts the spike-wave discharge burst

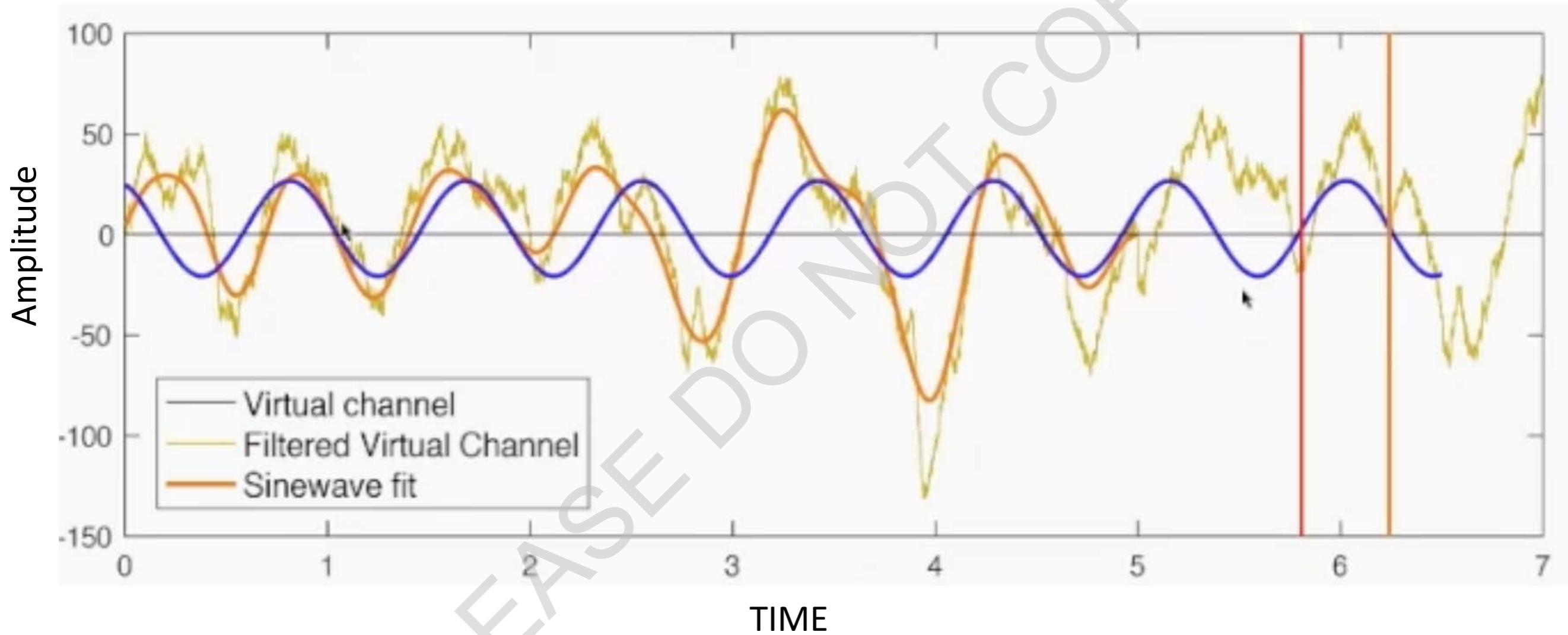
Closed-Loop Studies in human sleep

Clark et al., 2017

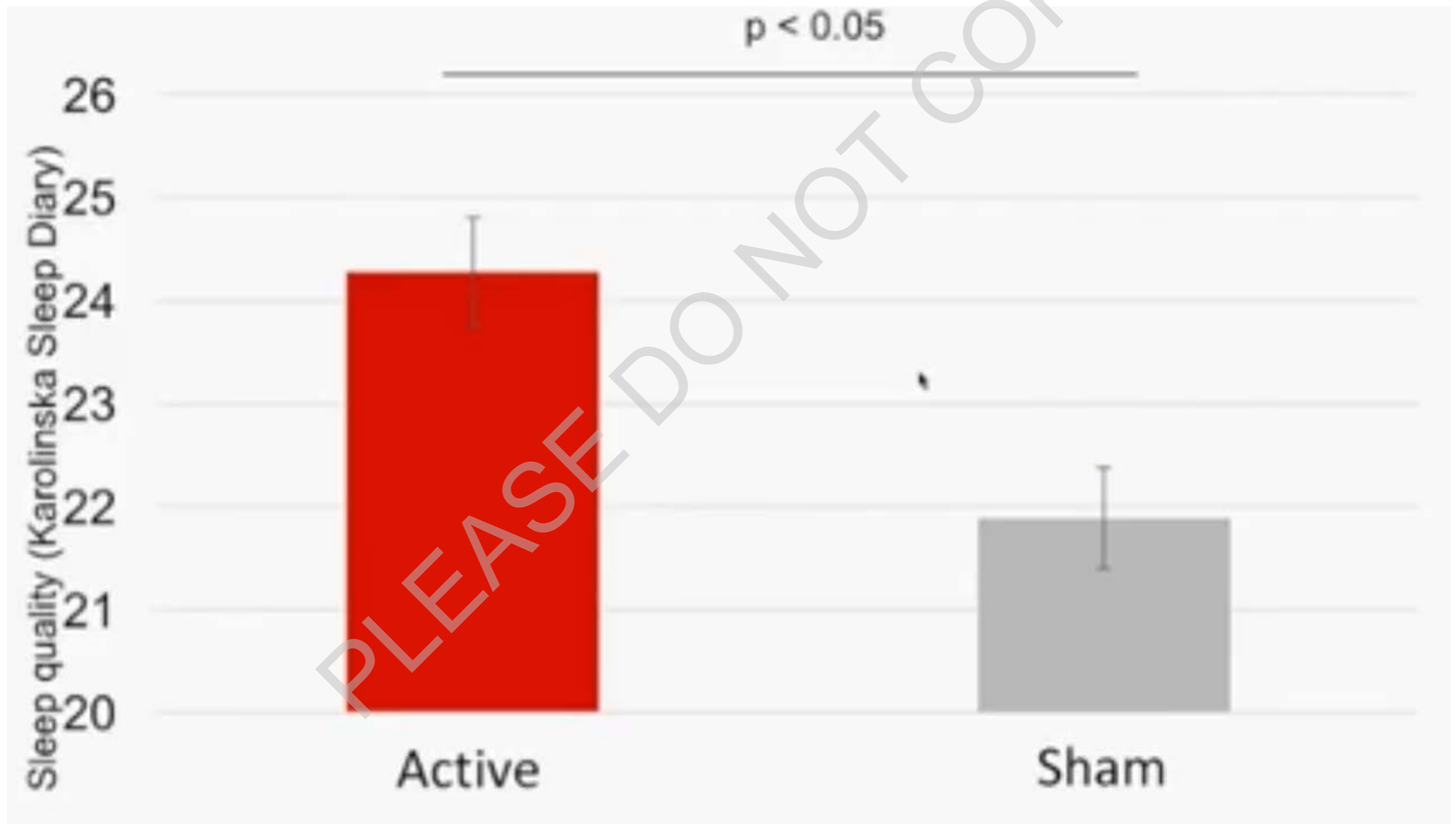


Closed-Loop Studies in human sleep

Enhancing slow waves improves memory



Closed-Loop Studies in human sleep

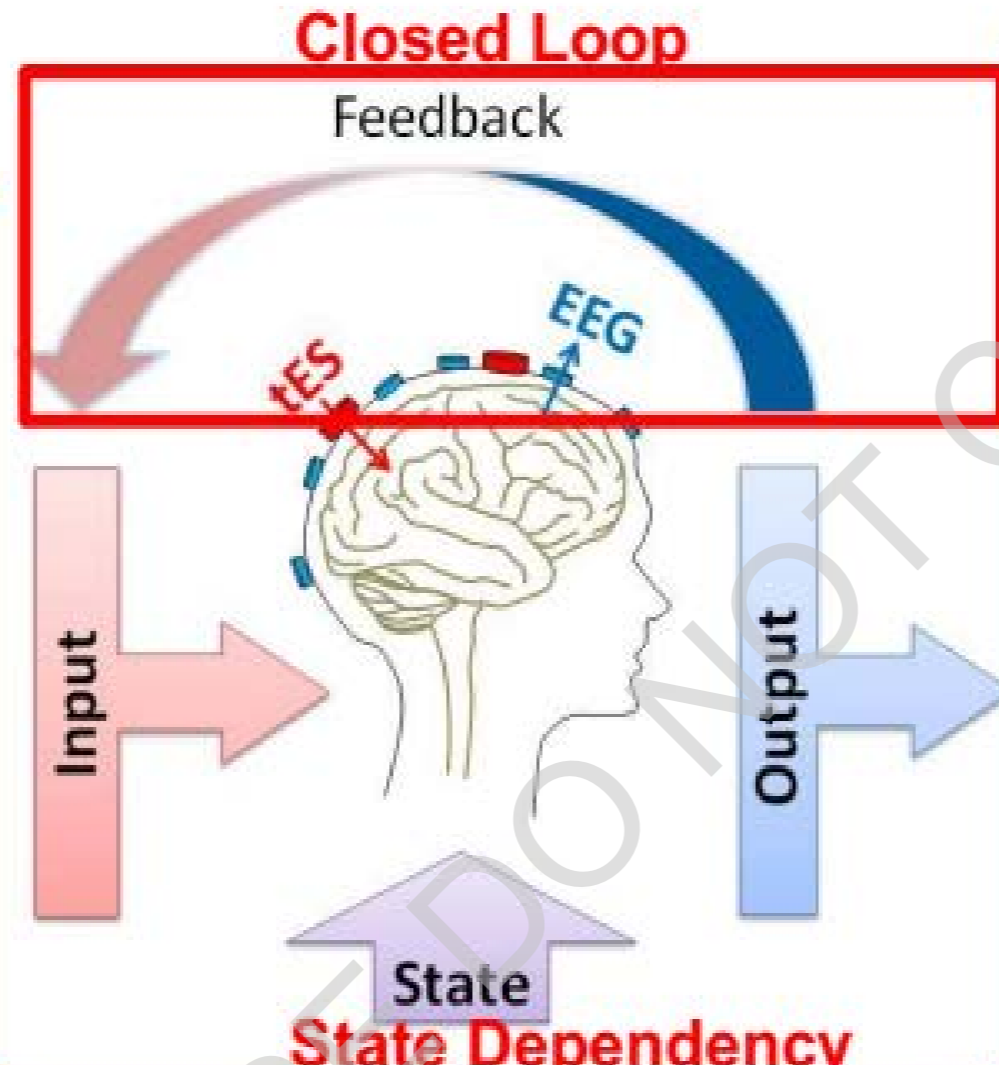


Choose Parameters

Input Location	
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Functionally guided	fMRI TMS EEG

tES Input Parameters	
Intensity	Standard Guided
Frequency	Standard EEG Guided

Input Time
Guided with respect to a brain state



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Local/Network Effects

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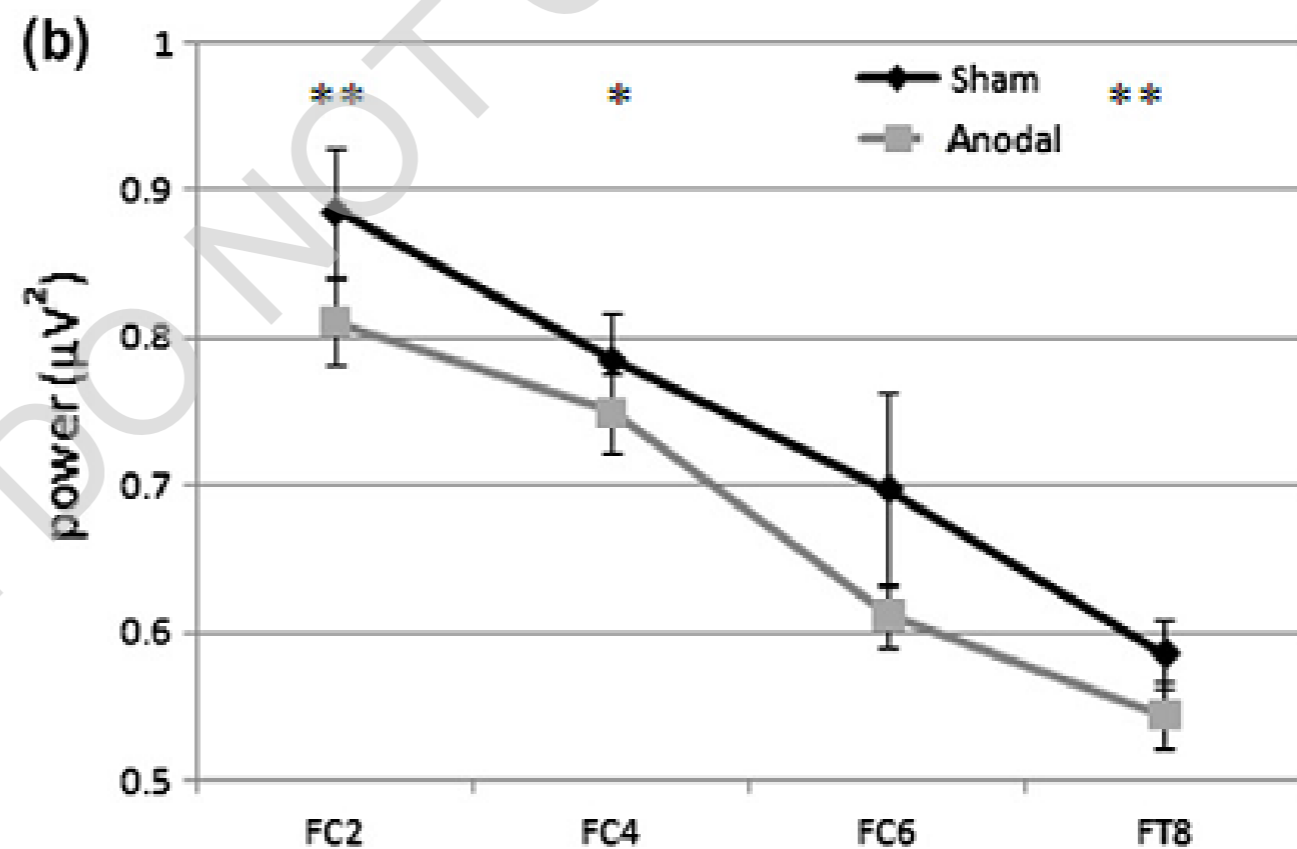
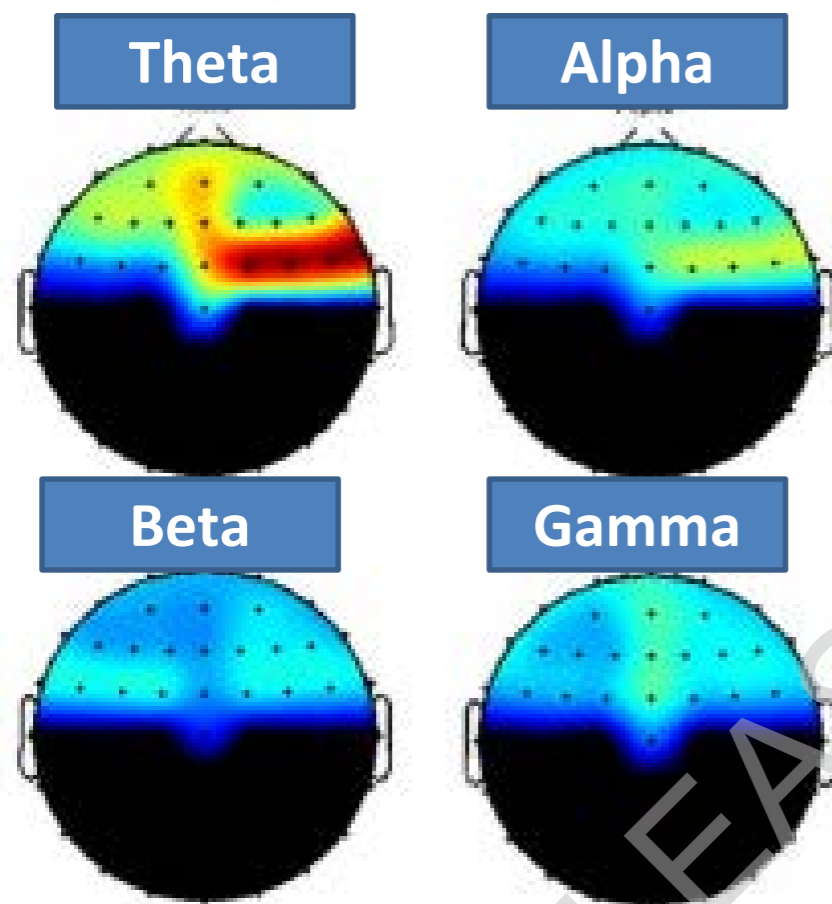
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<ul style="list-style-type: none"> • Directed-transfer function • Partial directed coherence 	Directed functional connectivity e.g., Information flow

Output Time
<ul style="list-style-type: none"> • Relative to input time • Relative to a brain state

Output Measures: Power/Amplitude - Local effects

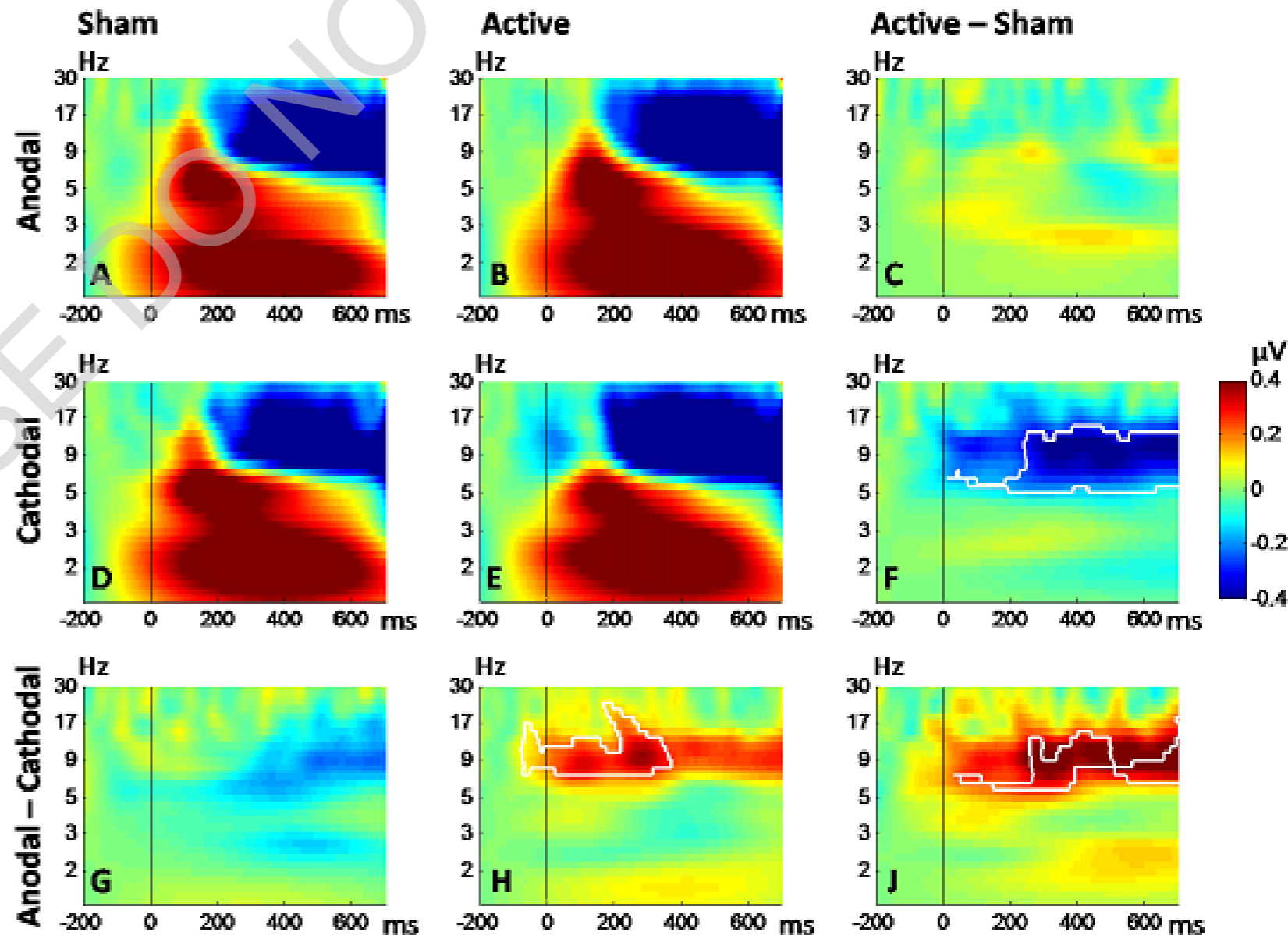
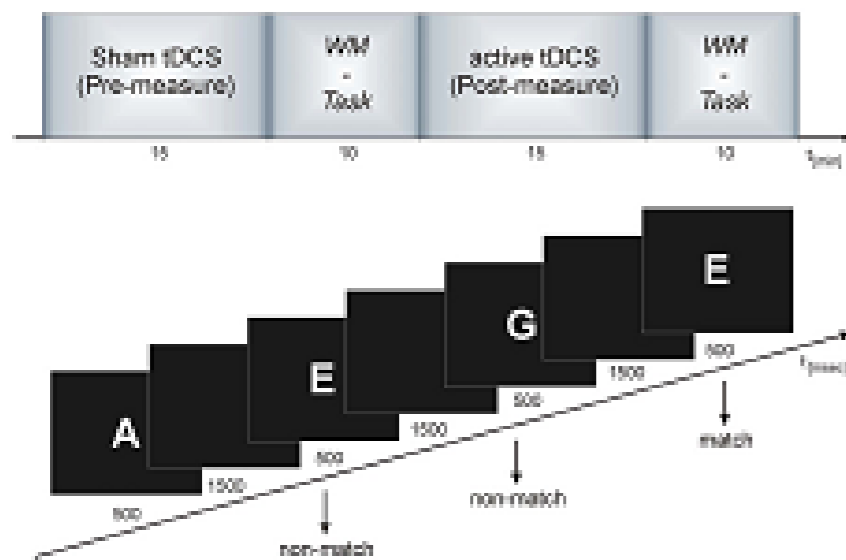
Jacobson et al., 2012

- **Anodal** tDCS on right Inferior Frontal Gyrus, **Cathode** on OFC
- Offline approach, tDCS + task, EEG before/after



Decrease in Theta power after tDCS

Occipito-Parietal Electrodes...



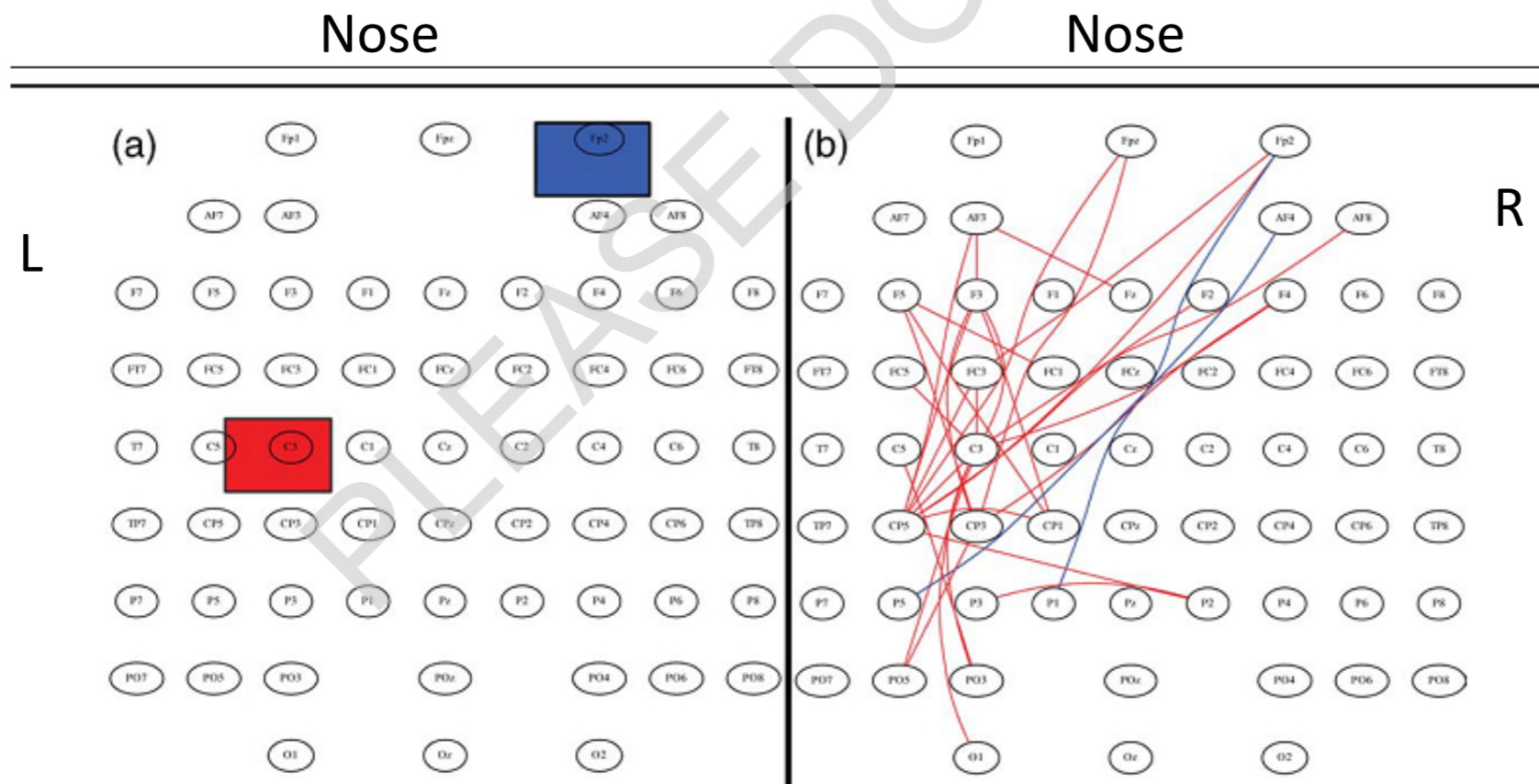
- **Increased** Theta and Alpha power after **Anodal tDCS**
- **Decreased** Alpha power after **Cathodal tDCS**

Output: Connectivity

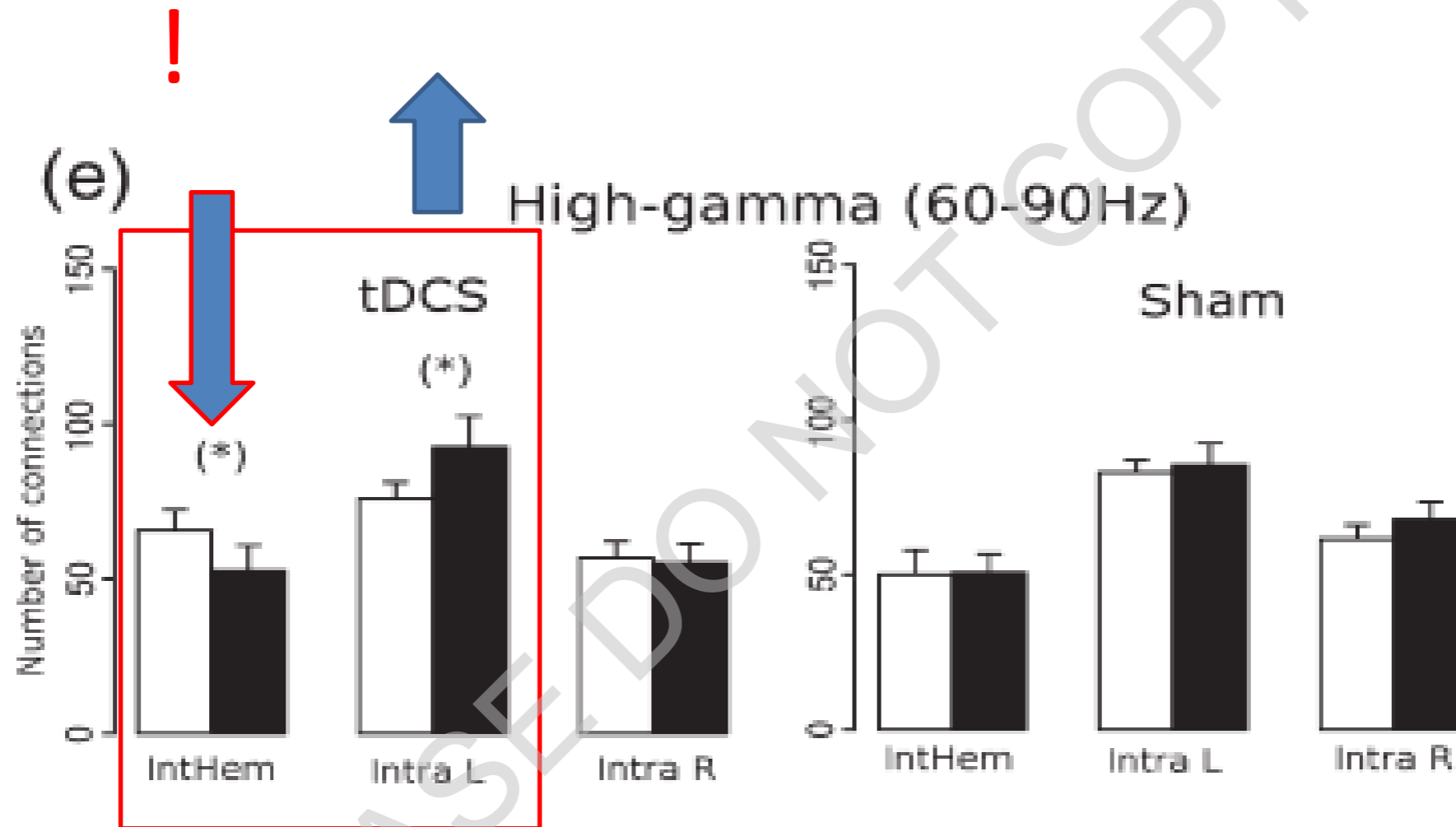
Polania et al., 2011

- 10' of **anodal** tDCS over M1
- **Cathode** on the contralateral Forehead
- 62 Channels **EEG recording Before & After, Resting & Task**
- **Output** → Connectivity metrics (Synchronization Likelihood) in directed and undirected graphs, for each frequency band.

Task PRE – Task POST , High Gamma @ 60-90Hz
tDCS **Increases** connectivity between motor, premotor and suppl. motor areas.



ACTIVITY DURING MOTOR TASK



- tDCS **Increases** connectivity between left motor, premotor and suppl. motor areas.
- tDCS **Decreases** interhemispheric connectivity in High-Gamma during task.

Other multimodal approaches?

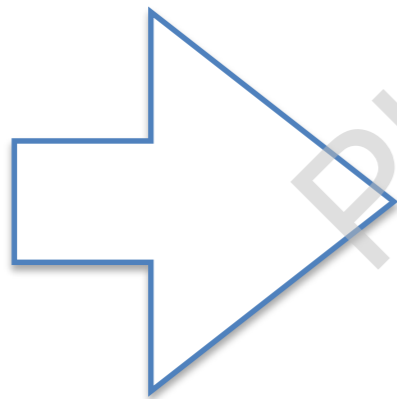
- tCS + TMS-EMG

- tCS + EEG (Resting – ERPs)

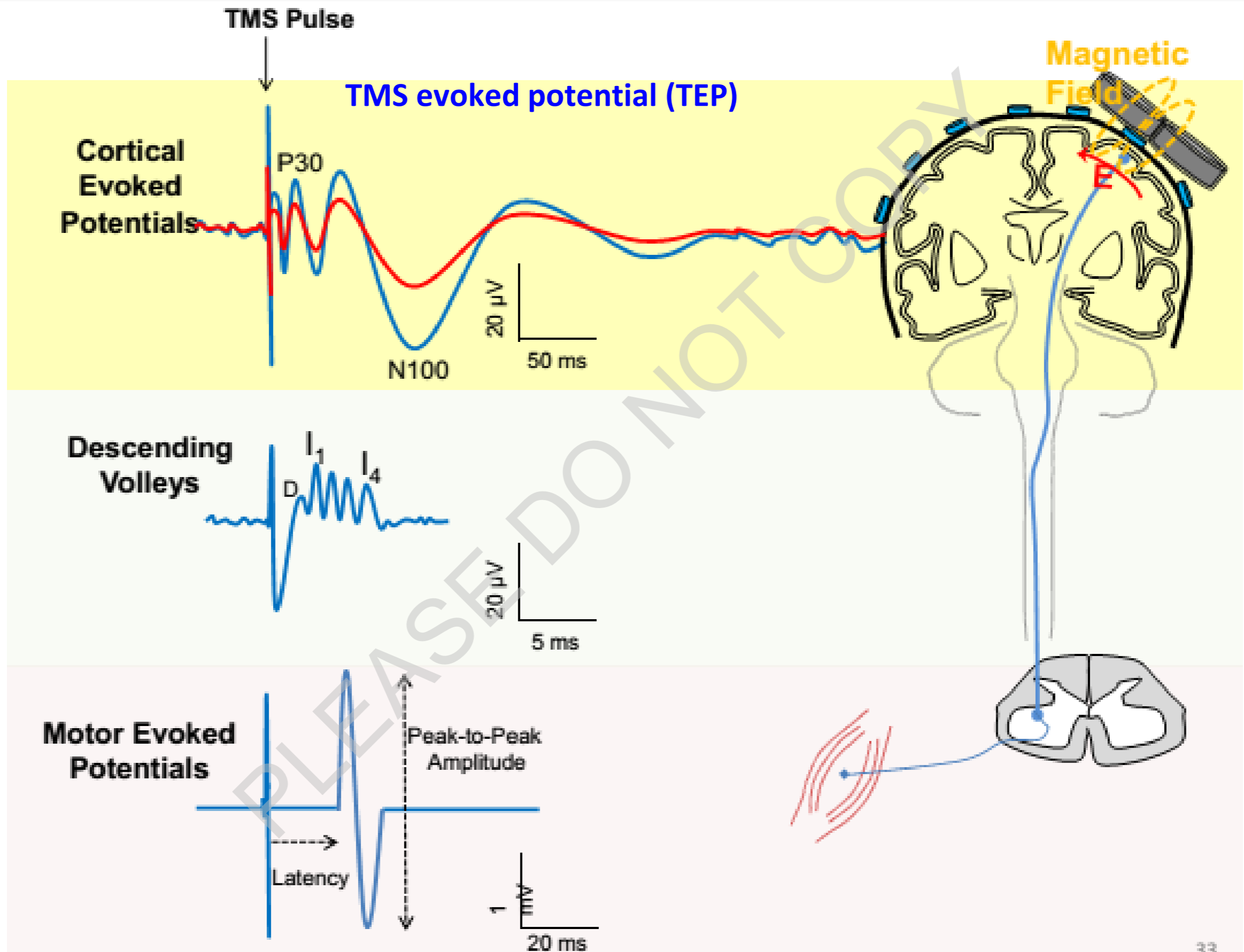
- *tCS + fMRI*

- *tCS + NIRS*

- *....tCS + TMS-EEG ?*

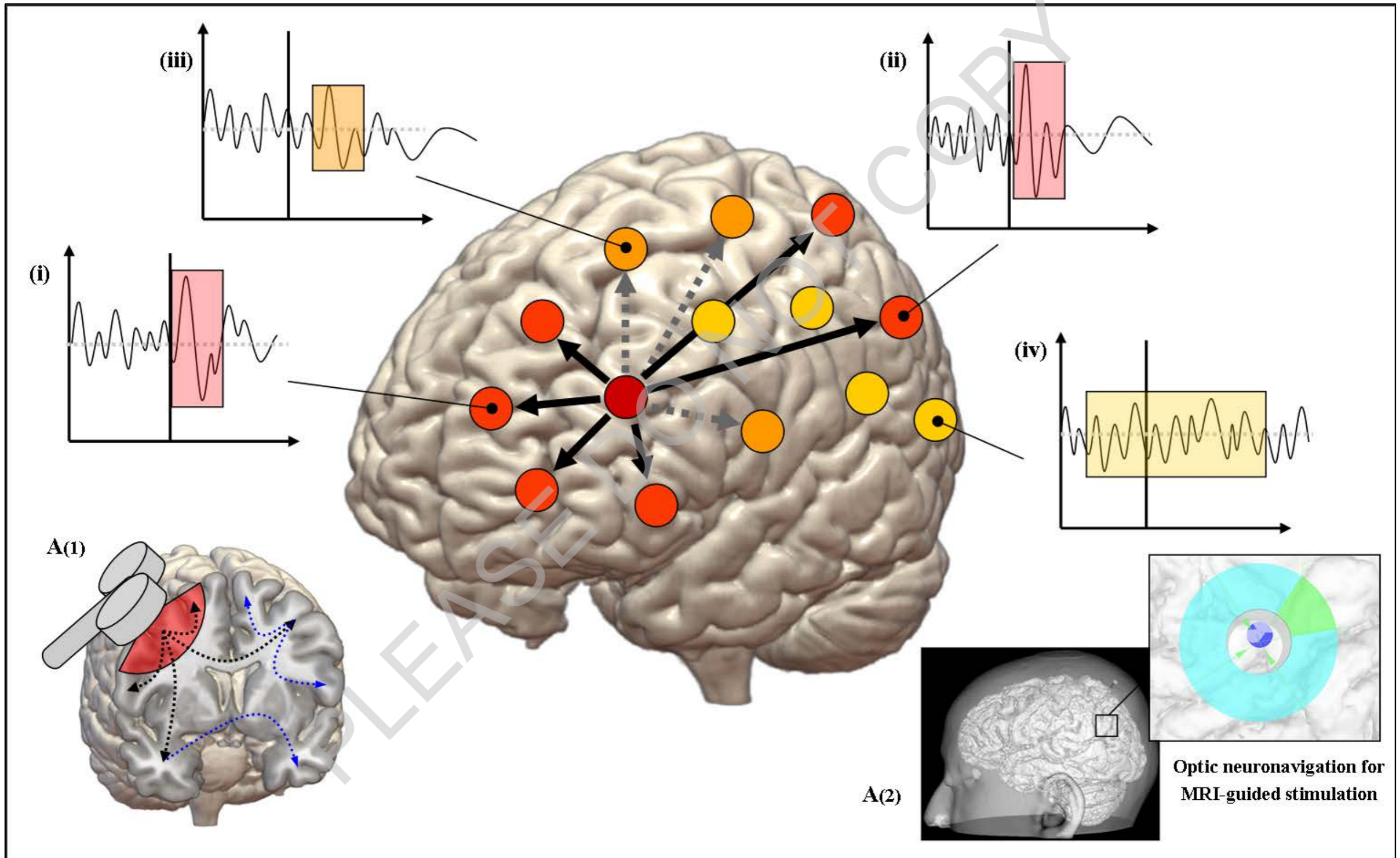


TMS-EEG



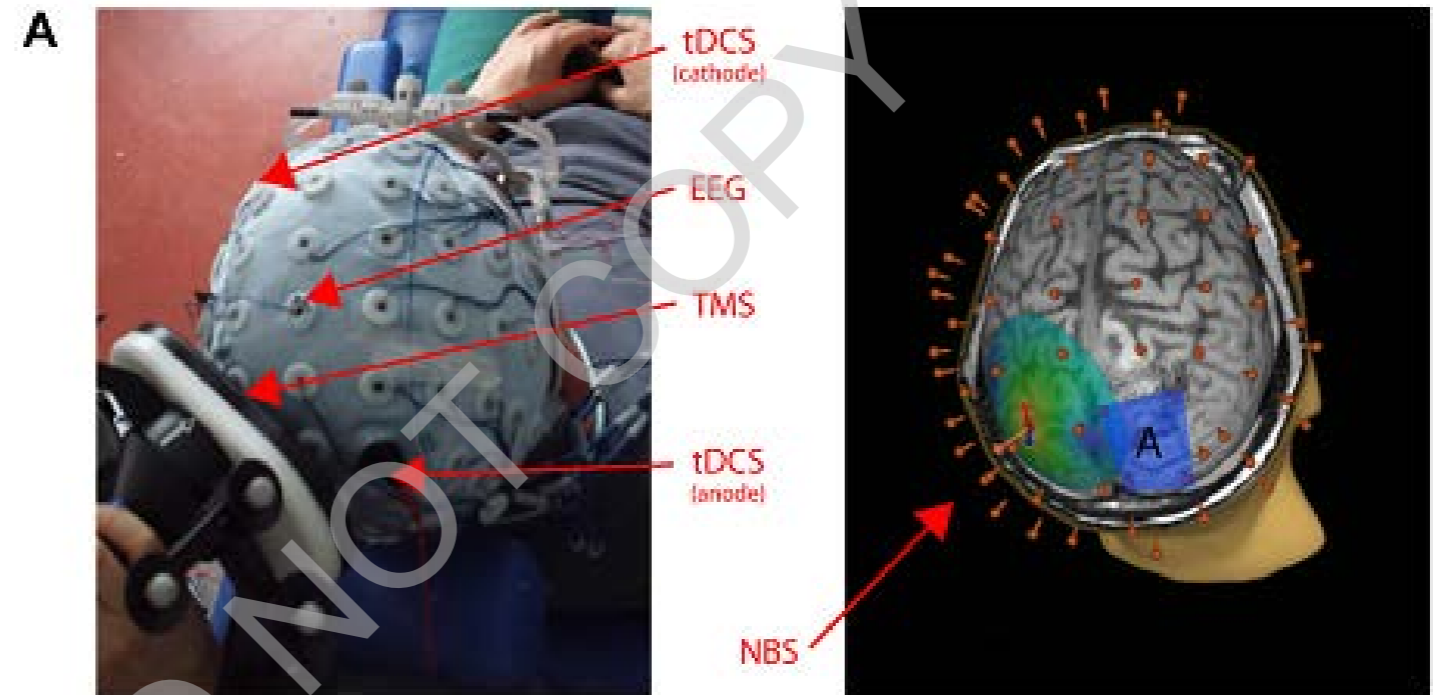
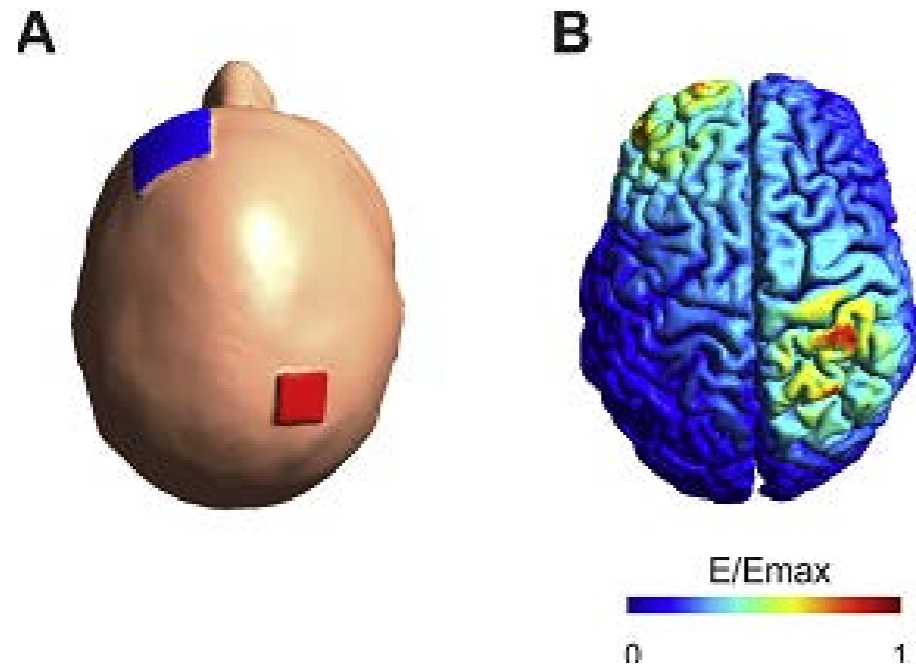
TMS-EEG

Santarneccchi et al. 2016, SPJ



TMS-EEG to investigate local and distant tDCS effects

Romero Lauro et al., 2014



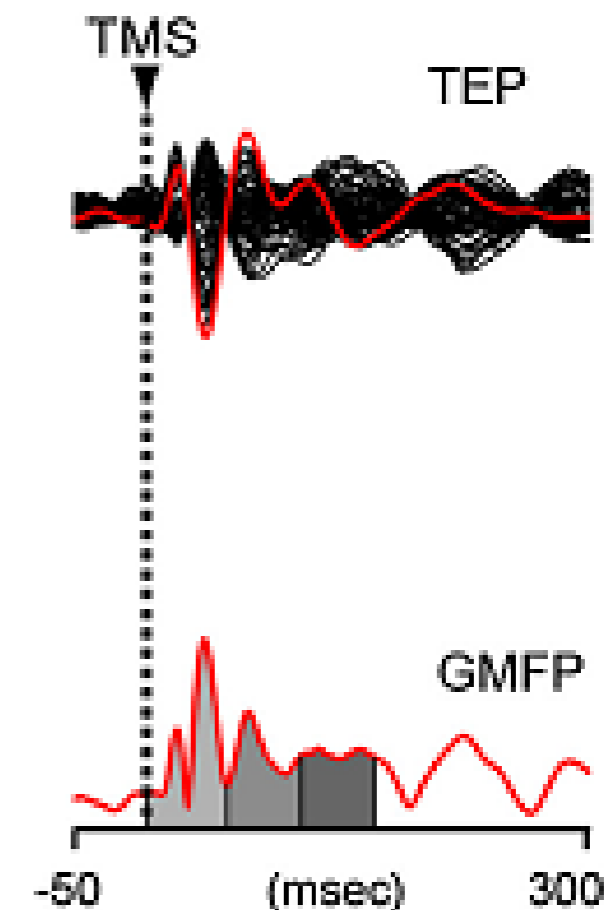
- 14 right-handed participants
- 0.75mA for 15' (anodal tDCS) + Sham
- 60 Channels EEG
- Masking Noise for TMS click

Output: TMS-Evoked Potentials (TEP) as a cortical activity/reactivity measure

Global Excitability Index: Global Mean Field Power (GMFP)

Local Excitability Index: Local Mean Field Power (LMFP) over 6 different clusters of electrodes, left/right Frontal-Temporal-Parietal.

3 Time windows: 0-50ms, 50-100ms, 100-150ms



TMS-EEG to investigate local and distant tDCS effects

Global Mean Field Potential

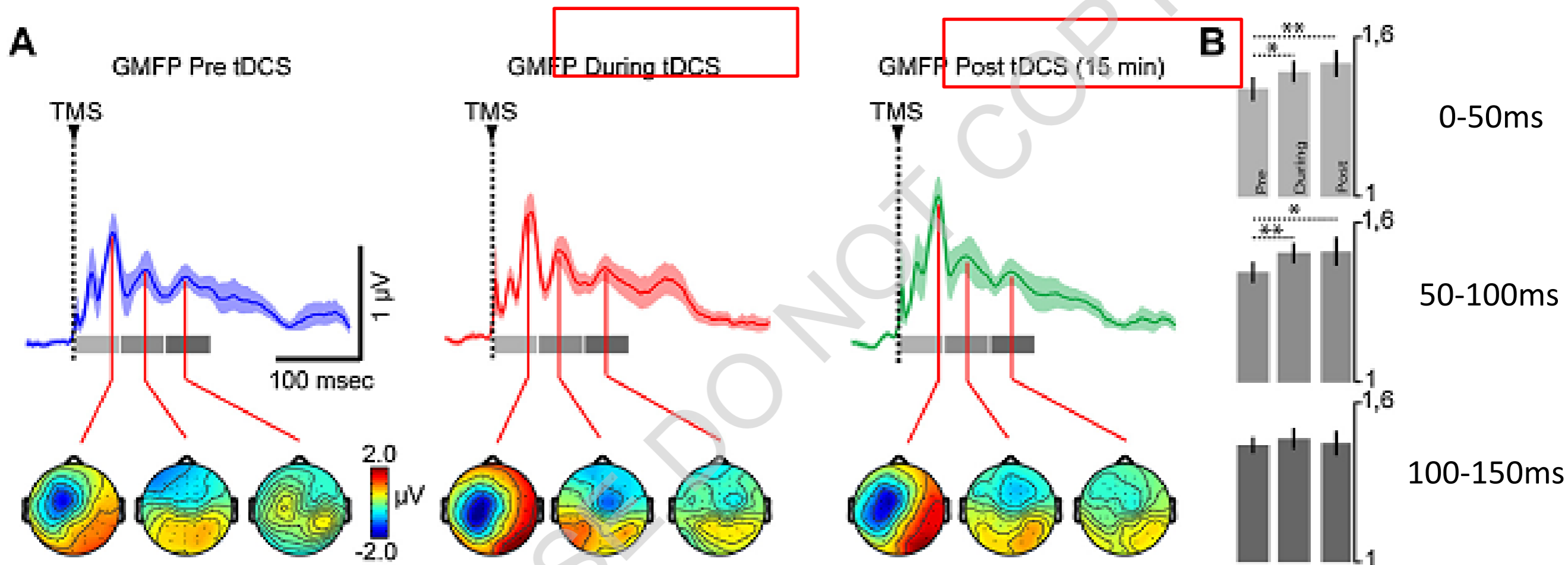
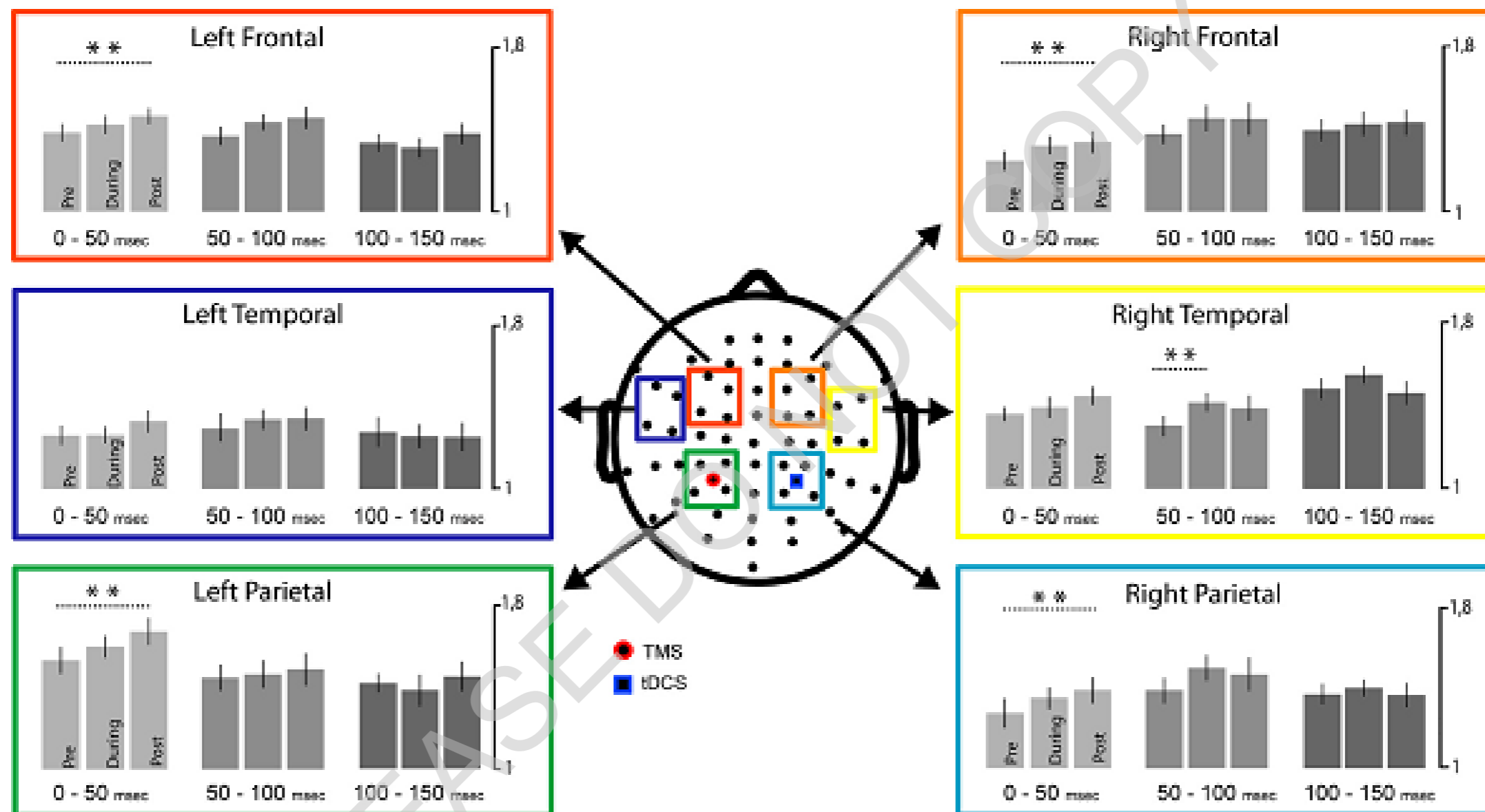


Fig. 2 – Panel A (upper row) shows the Grand Average of GMFP computed by averaging the GMFPs calculated for each subject in the three experimental conditions (pre tDCS = blue trace \pm SE; during tDCS = red trace \pm SE; post tDCS = green trace \pm SE). The lower row of Panel A represents the mean topographies computed in correspondence of the local maxima for each of the three time windows (0–50 msec = light gray, 50–100 msec = gray, 100–150 msec = dark gray) across the 14 study participants (see also Fig. 1). Panel B shows bar histograms representing the mean values \pm SE of the integrated GMFP in the three time windows of interest (0–50 msec = light gray, 50–100 msec = ash, 100–150 msec = graphite) for each experimental condition.

TMS-EEG to investigate local and distant tDCS effects

Local Mean Field Potential as an index of distant effects



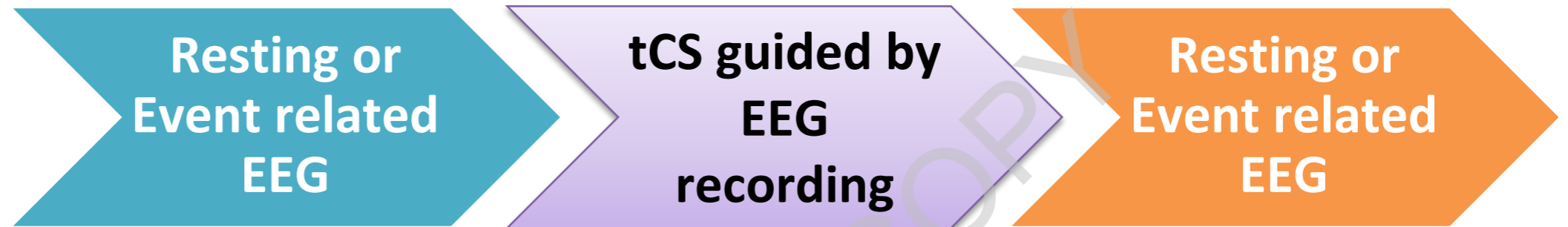
Effects are (i) mostly in the 0-50ms window, which is expression of inter-regional monosynaptic connections; (ii) exclusively in the POST tDCS

ONLINE tDCS → unclear

OFFLINE tDCS → more specific, network-based effects

Technical challenges

EEG-Guided,
closed-loop
system



Stimulation Artifact during EEG recording

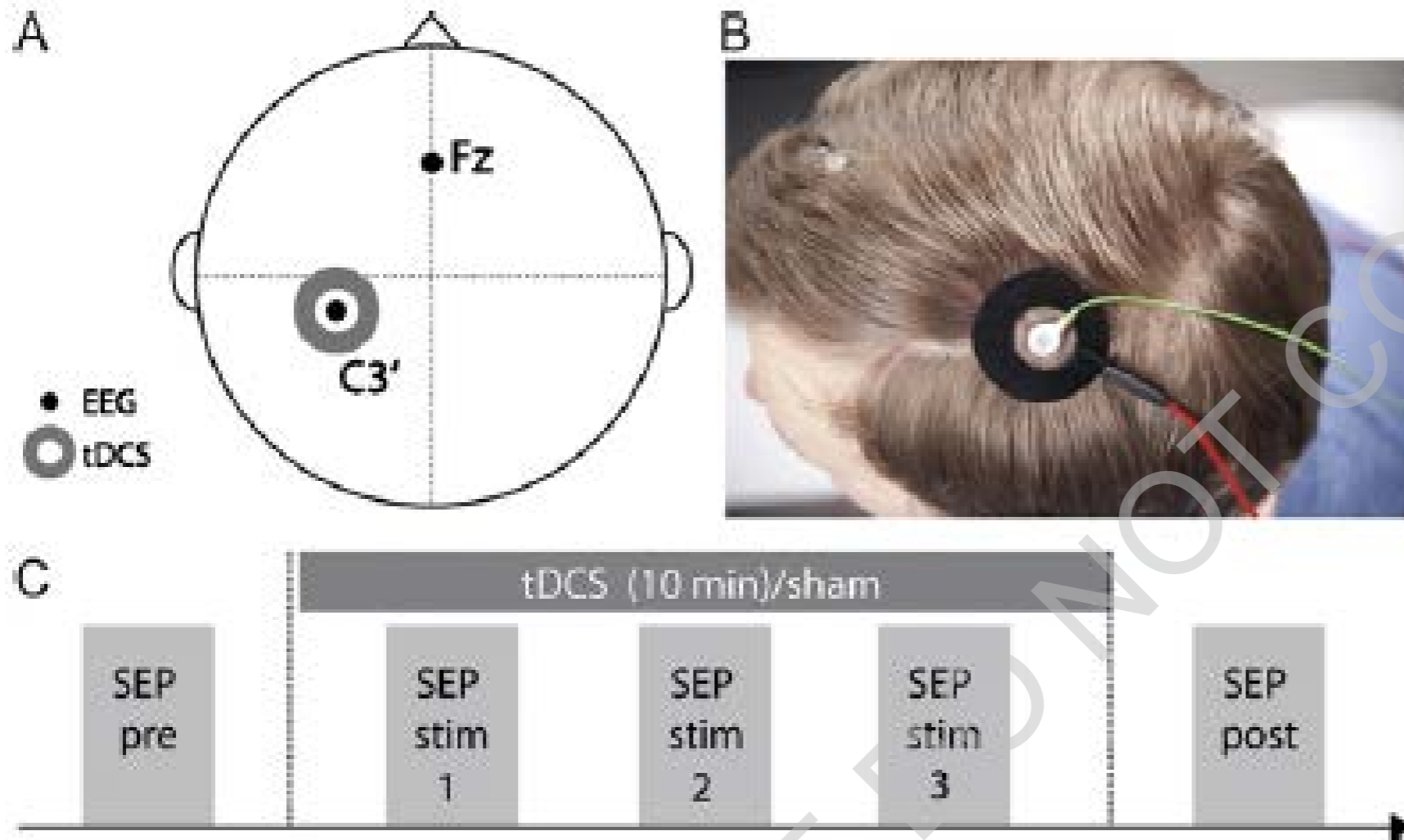
tDCS

- Relatively easier, Available tools (algorithm) to “clean” the data from Drifts

tACS

- Artifact is bigger and affects the EEG band of interest (!).
- *Specific filtering* can be applied (reduces the available spectrum)

EEG during tDCS

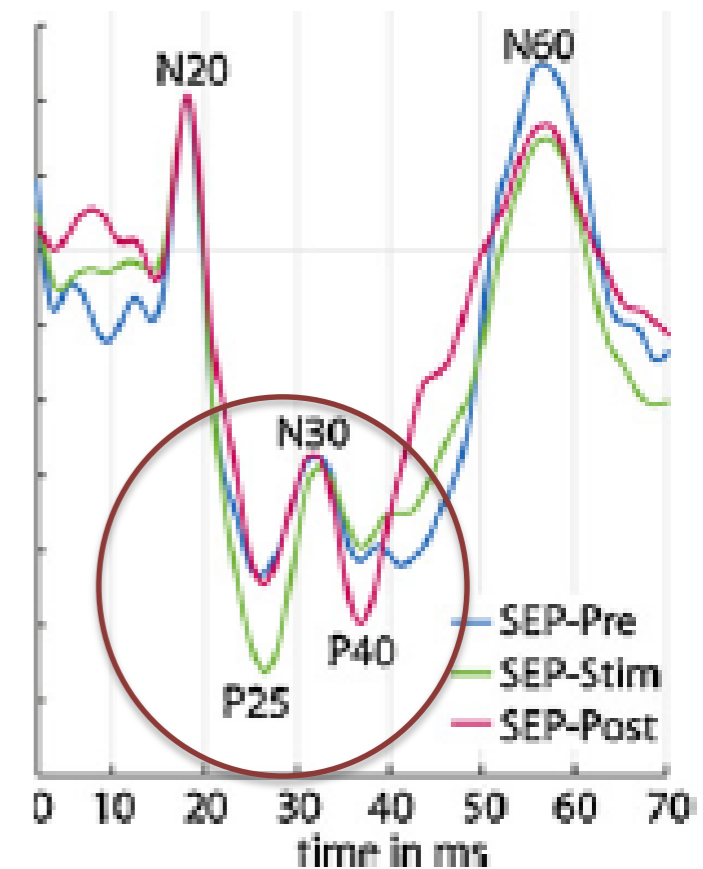
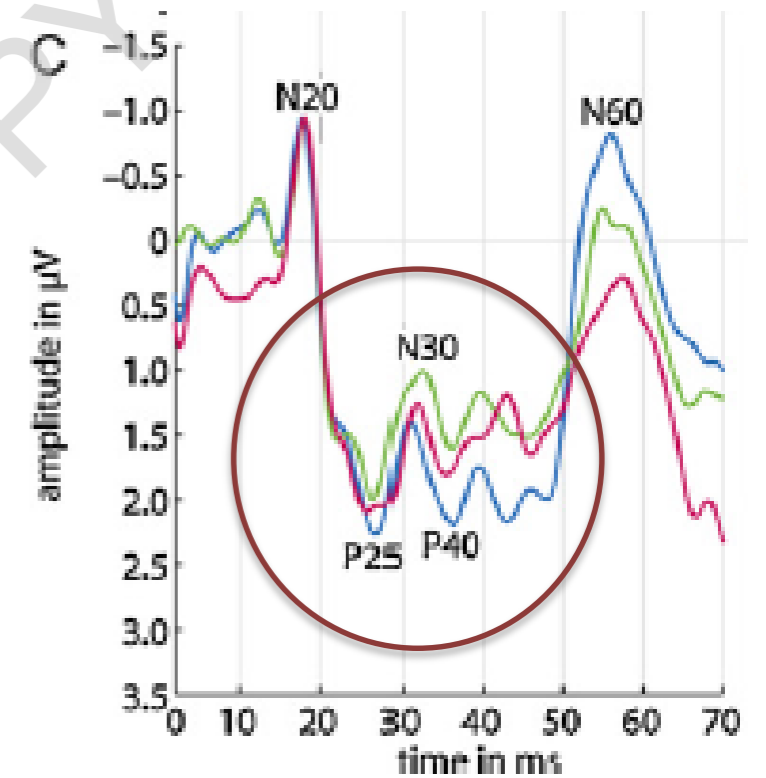


SEP: somatosensory evoked potential

3rd order Butterworth filter (1-250Hz) to eliminate tDCS induced blurring of EEG response.

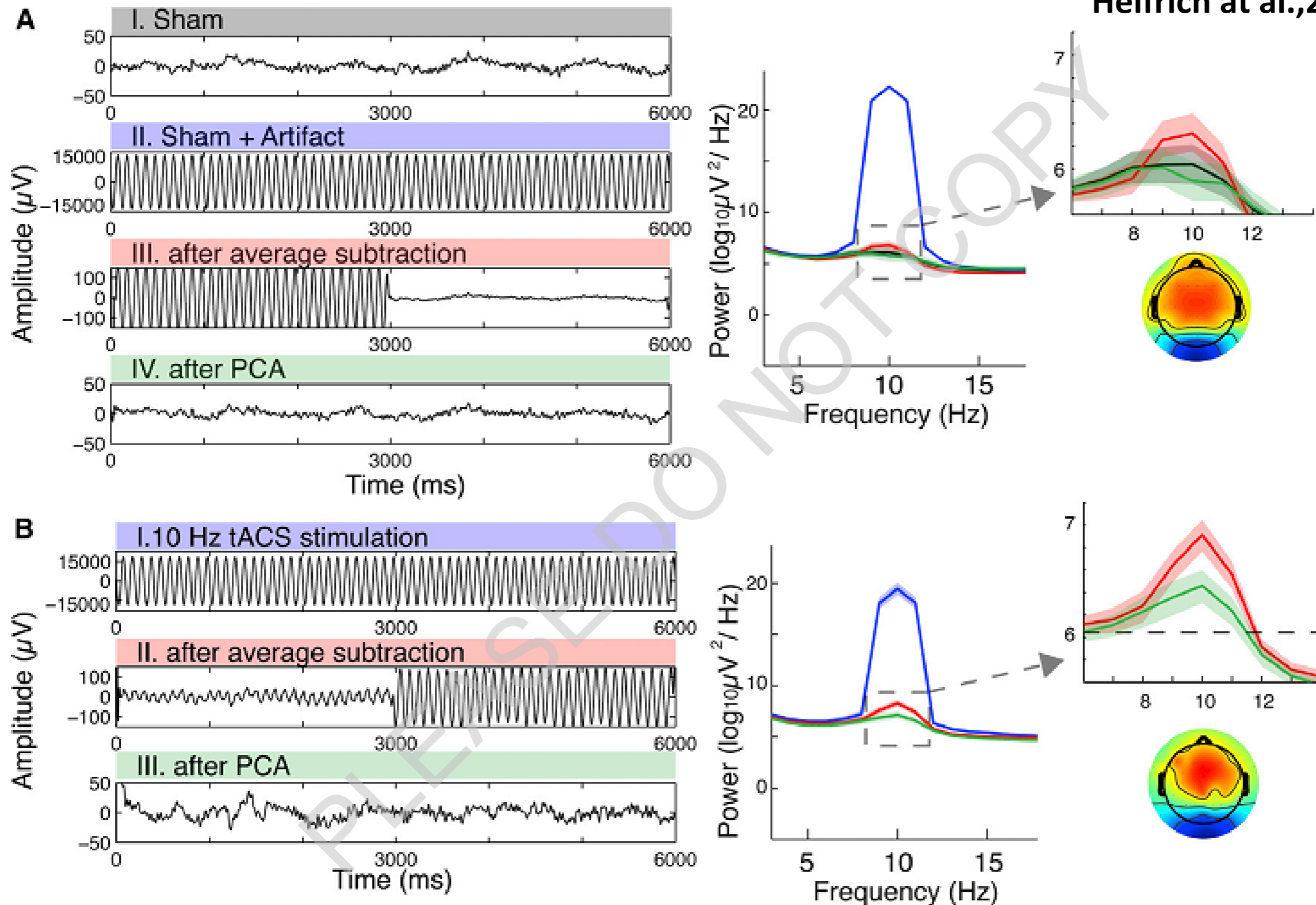
POSTPROCESSING

Sehm et al., 2013



EEG during tACS

Helfrich et al., 2014



**Moving Average + Principal Component Analysis to Capture and eliminate the artifact
(?)**

Take home

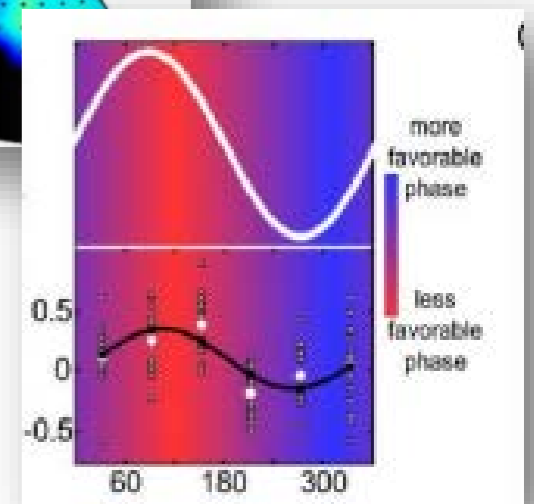
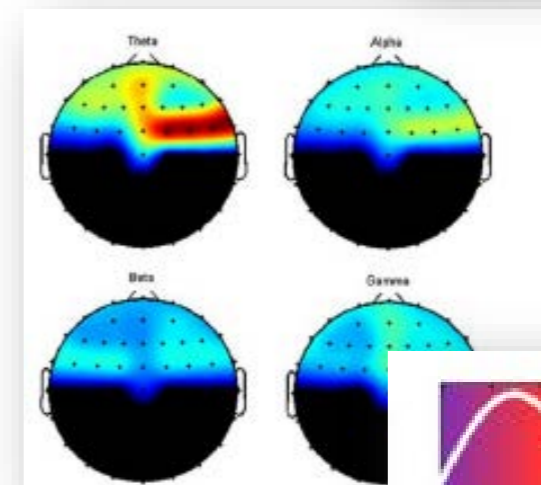
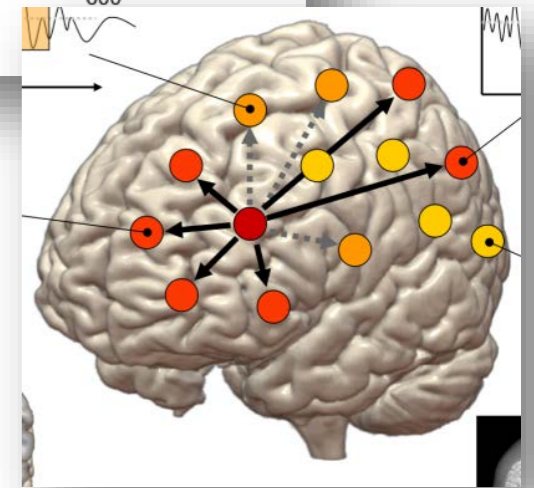
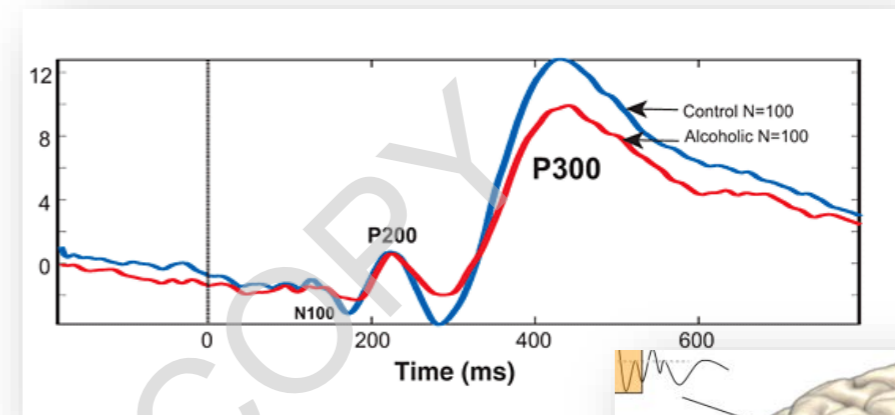
- Understand of Motor and non-Motor

tCS effects

- Capture **Distant effects** other than cortical excitability (e.g. Power, Coherence, Connectivity)

- Guide tCS interventions (closed loop, etc.)

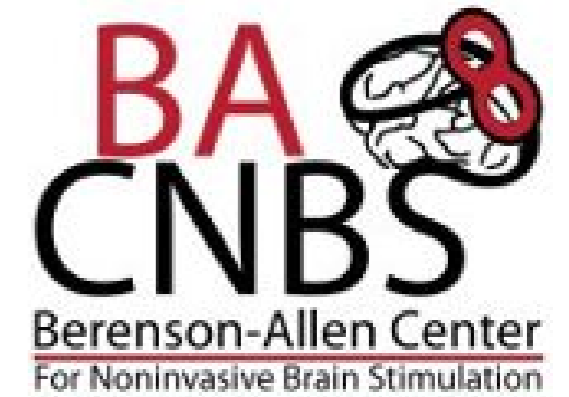
- Interact with complex dynamics (e.g. CFC, phase-related processing)



Questions? Comments? Ideas? Feedback?



- dcappon@bidmc.harvard.edu
- davide.balos.cappon@gmail.com



Thank you for your attention

dcappon@bidmc.harvard.edu