

Mining Cognitive Brain Dynamics I



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14th EEGLAB Workshop @ Beijing, China

June, 2012

Functional Brain Imaging

Some human brain imaging milestones

1926 ~1st human EEG recording

EEG era

1938 1st EEG spectral analysis

1962 ~1st computer ERP averaging (CAT)

ERP era

1979 1st event-related desynchronization

1993 1st fMRI BOLD recordings

fMRI era

1993 1st broadband ERSP

1995 1st multisource EEG filtering by ICA

2009 ~1st commercial dry electrode EEG toys

fEEG / BMI / MoBI era ...

FIGURE 1-2—Sample of the first EEG tracing taken at the Bradley Hospital, E. Providence, Rhode Island, by H. Jasper and L. Carmichael. Subject: Carl Pfaffmann. Date: July 9, 1934. Record, which shows prominent alpha rhythm of about 11.5 per second, was made with a Westinghouse, galvanometer-type, mirror oscillograph. Time line above: 25 Hz.



FIGURE 1-1.—Professor Hans Berger (1873–1941), neuro-psychiatrist, University of Jena, Jena, Germany, first to discover and describe in 1929 a unique kind of electrical activity recorded from the brain of man, which he named the electroencephalogram (Elektrenkephalogramm).

Brain Electrophysiology?

2011 →

ERP

←→

~~EEG~~

~~←→~~

~~LFP~~

←→

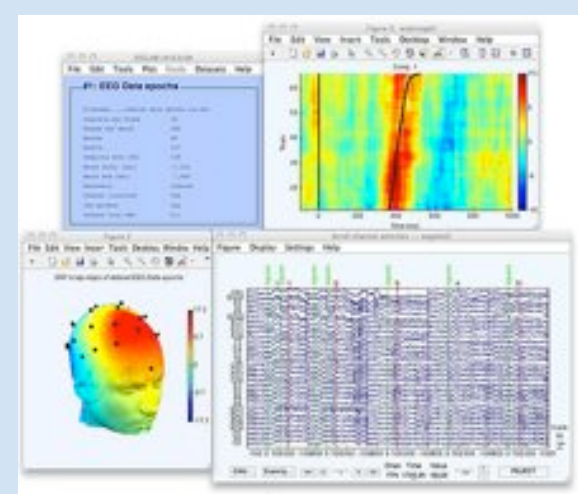
#Spikes

1993→

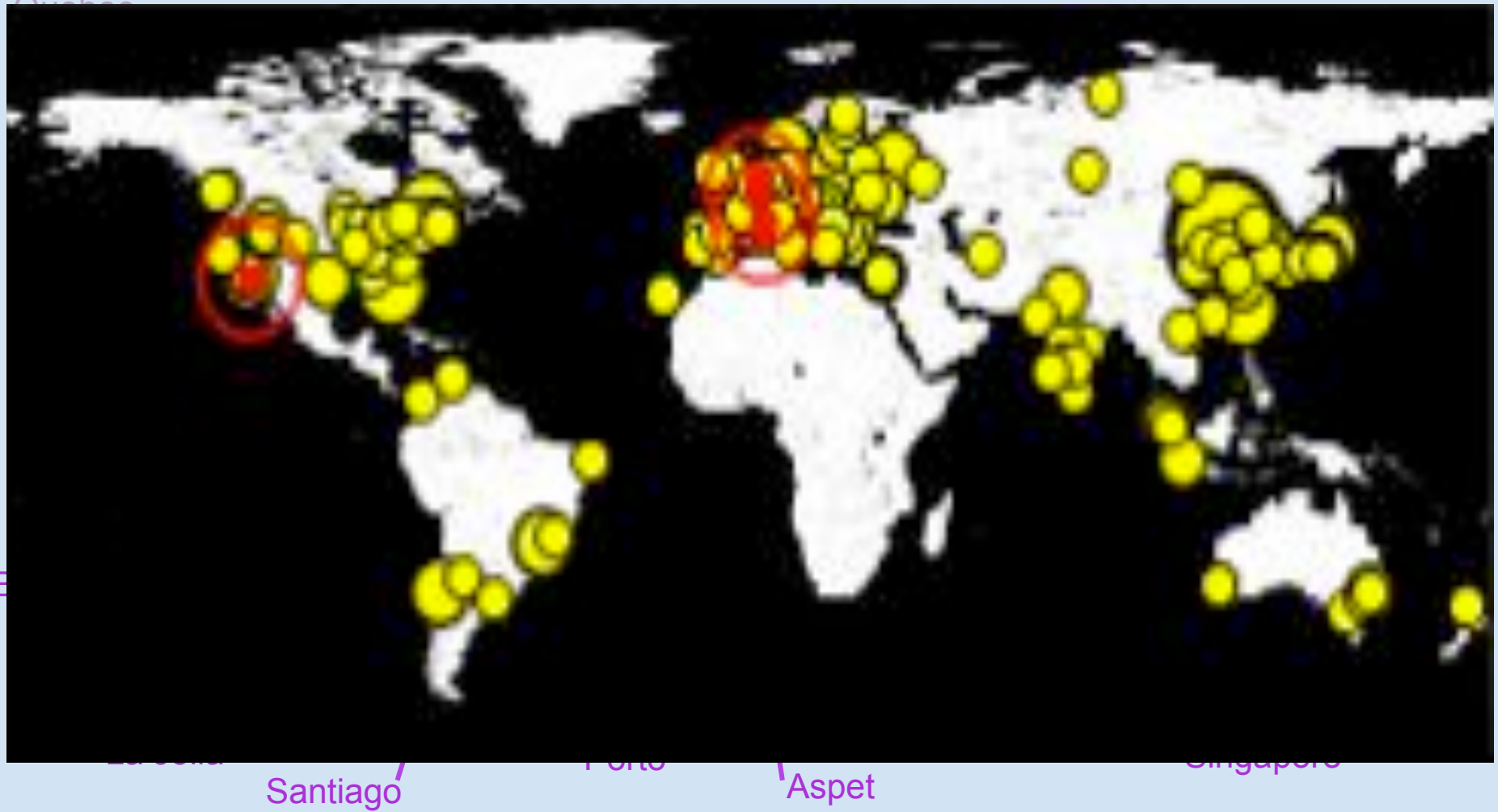
2000→

EEGLAB History

- 1993 – ERSP / ITC (Makeig)
- 1995 – Infomax ICA for EEG (Makeig, Bell, Jung, Sejnowski)
- **1997 - EEG/ICA Toolbox (cni.salk.edu), ITC & ERC**
- 1999 - ERP-image plots (Jung & Makeig)
- 2000 – EEGLAB GUI design (Delorme)
- **2002 – 1st EEGLAB (sccn.ucsd.edu)**
- **2004 - 1st EEGLAB plug-ins**
- **2006 - 1st EEGLAB STUDY structure and component clustering tools**
- **2009 – NFT (Neuroelectromagnetic Forward Head Modeling Toolbox)**
- **2009 – New toolboxes: SIFT, BCILAB, MPT**
- **2012 - HeadIT resource, ERICA (Experimental Real-time Interactive Control & Analysis)**
- **2012 – Workshop in Beijing**



EEGLAB Workshops





EEGLAB

Arnaud Delorme



BCILAB

Christian Kothe



MUET

David Groppe



AMICA

Jason Palmer



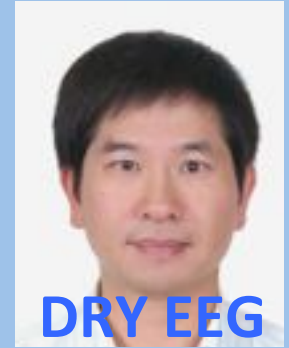
TEACH

Julie Onton



SIFT

Tim Mullen



DRY EEG

Tzyy-Ping Jung



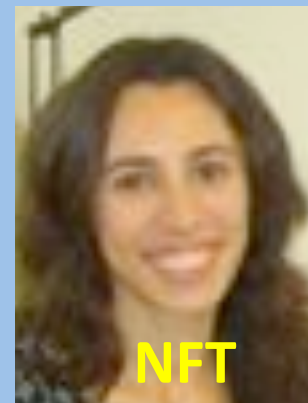
MoBILAB

Alejandro Ojeda



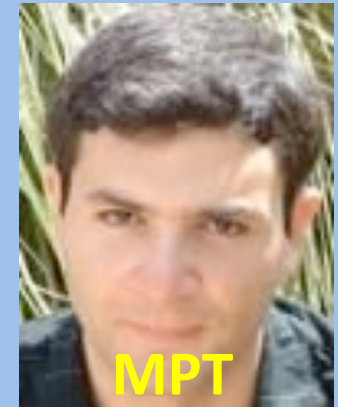
ICA

Tony Bell



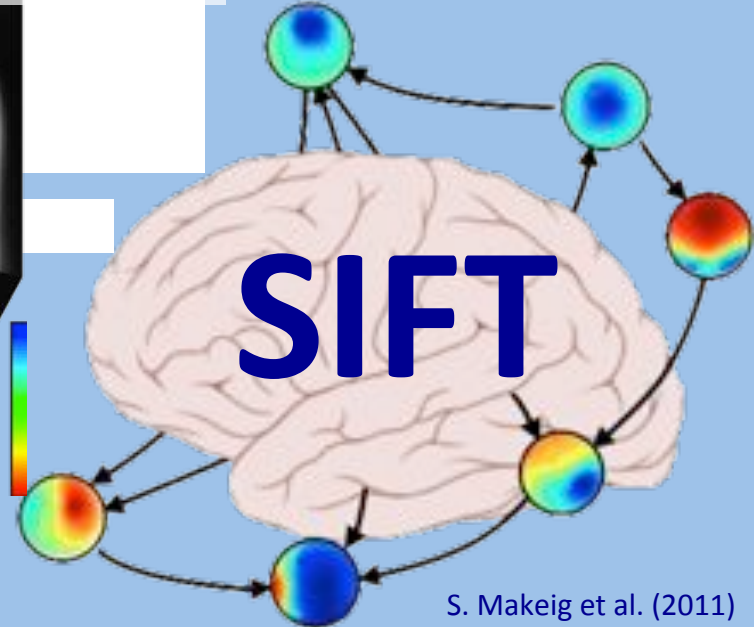
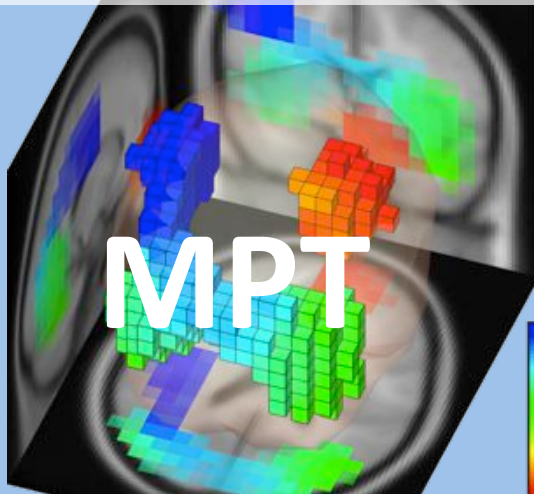
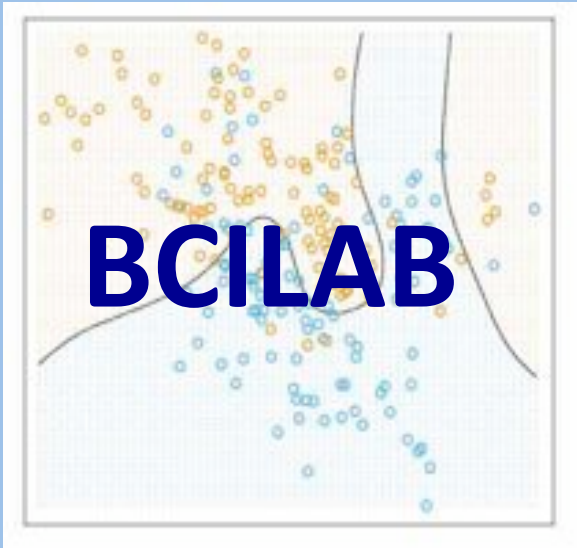
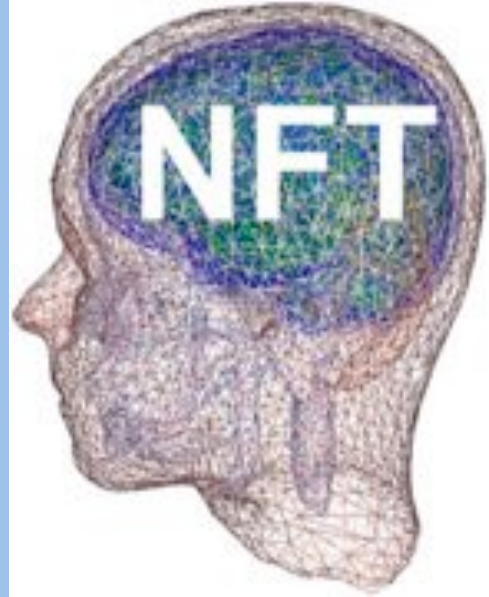
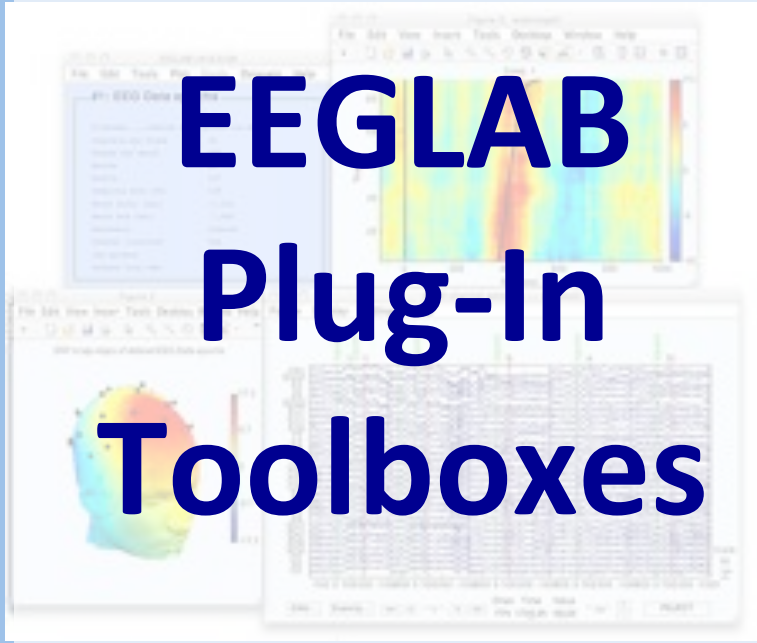
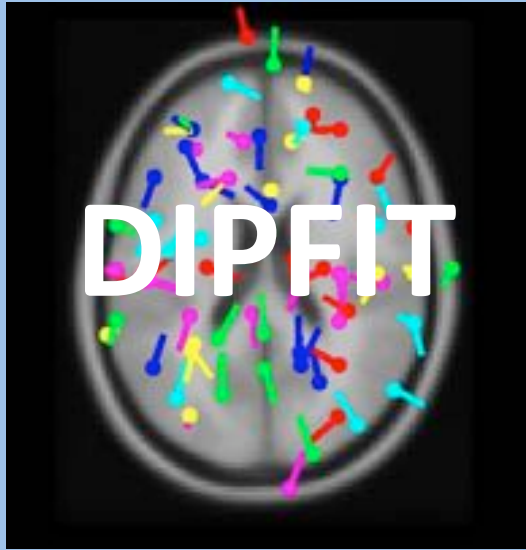
NFT

Zeynep Akalin Acar



MPT

Nima Bigdely Shamlo



I gaped ...
I tossed ...
I held ...
I jumped ...
I ducked ...
I answered ...

who

I reached ...
I ran ...
I shot ...
I threw ...
I pointed ...

am I?

I realized that ...

It struck me that ...

I wondered ...

All of a sudden ...

Distributed Brain

Dynamic Events

I noticed that ...

I decided that ...

It occurred to me that ...

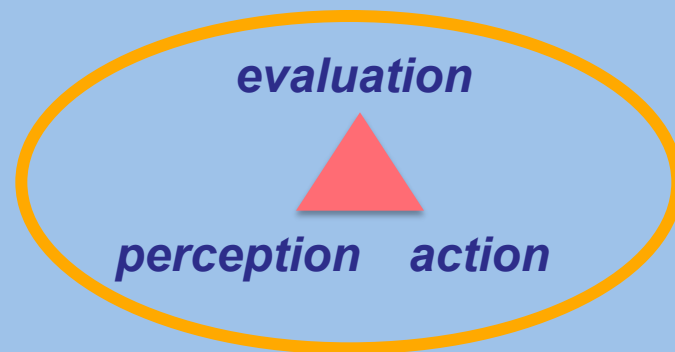
I imagined ...

I searched the scene for ...

Embodied Agency

Brain processes
have evolved and function
*to optimize the **outcome***
*of the **behavior***
the brain organizes
in response to
perceived challenges
and opportunities.

**Brains meet the challenge of
the moment!**



What is EEG?

Brain dynamics are inherently multi-scale

Local Extracellular Fields

EEG (scalp surface fields)

ECOG (larger cortical surface fields)

At each spatial recording scale, the signal is produced by active partial coherence of distributed activities at the next smaller scale.

Cross-scale coupling is bi-directional!

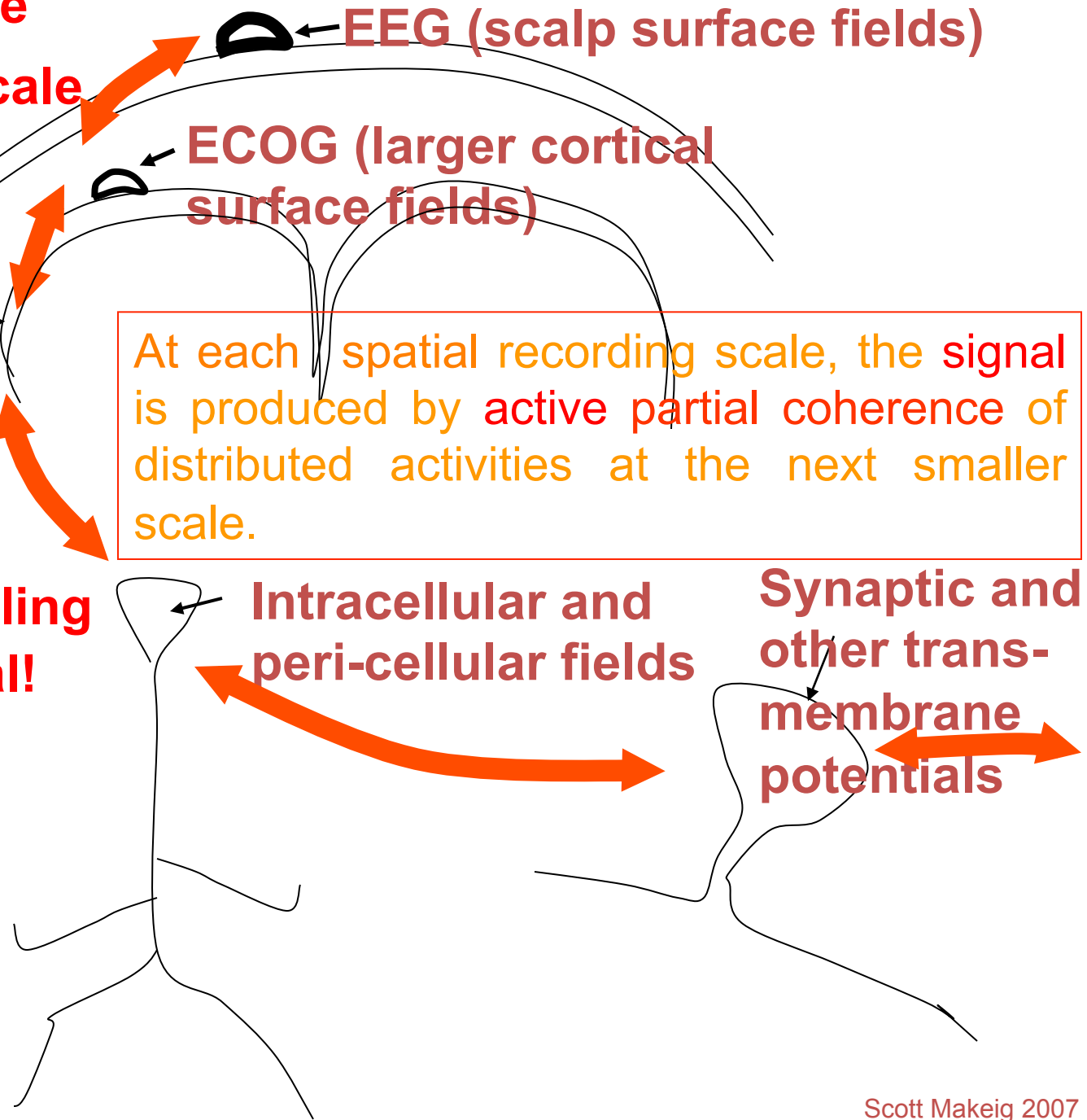
Intracellular and peri-cellular fields

Synaptic and other trans-membrane potentials

Larger



Smaller



Brain dynamics are inherently multi-scale

Local Extracellular Fields

EEG (scalp surface fields)

ECOG (larger cortical surface fields)

SCALE

At each spatial recording scale, the signals produced by active partial coherence of distributed activities at the next smaller scale.

CHAUVINISM

Cross-scale coupling is bi-directional!

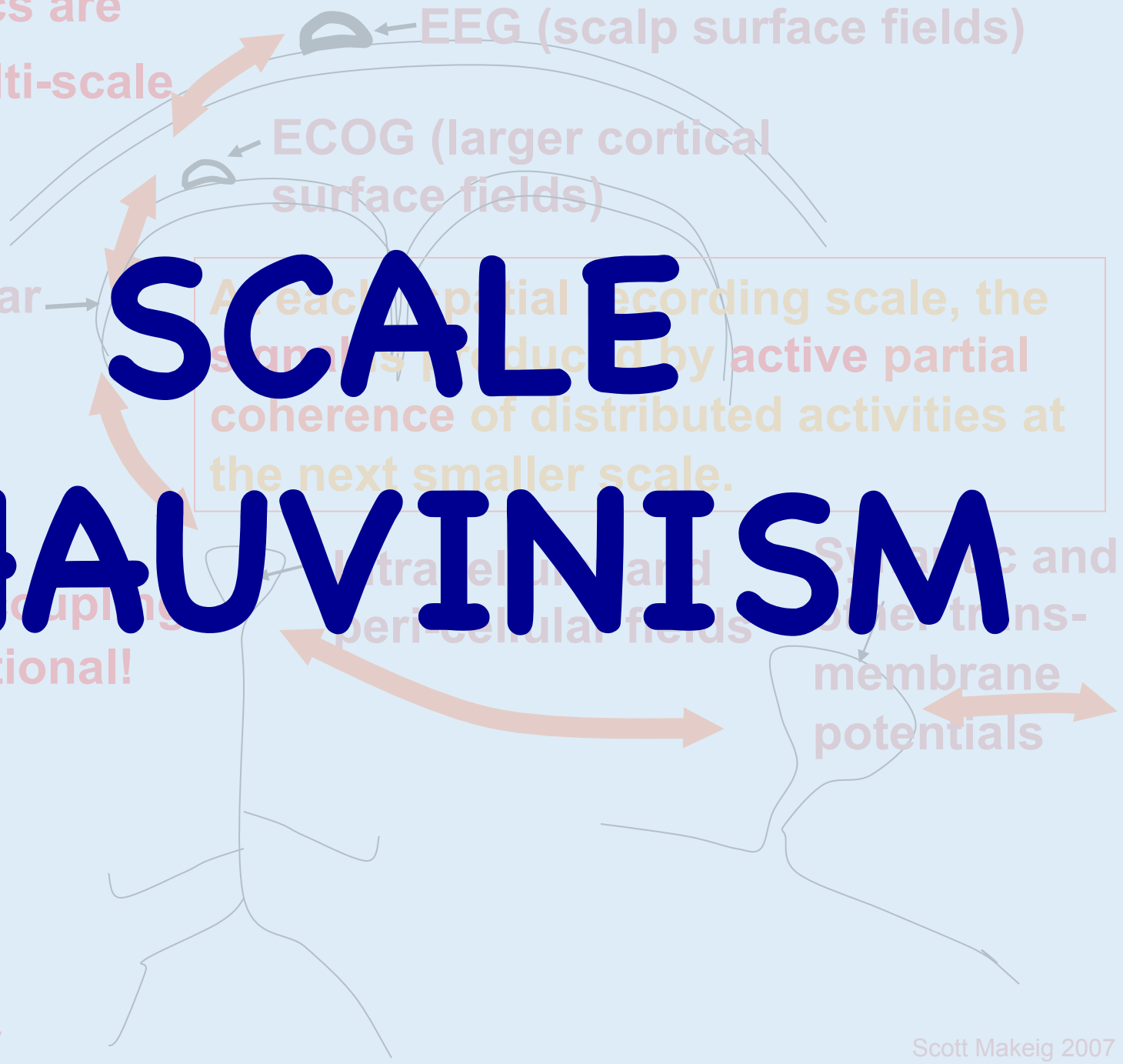
Intracellular and pericellular fields

membrane potentials

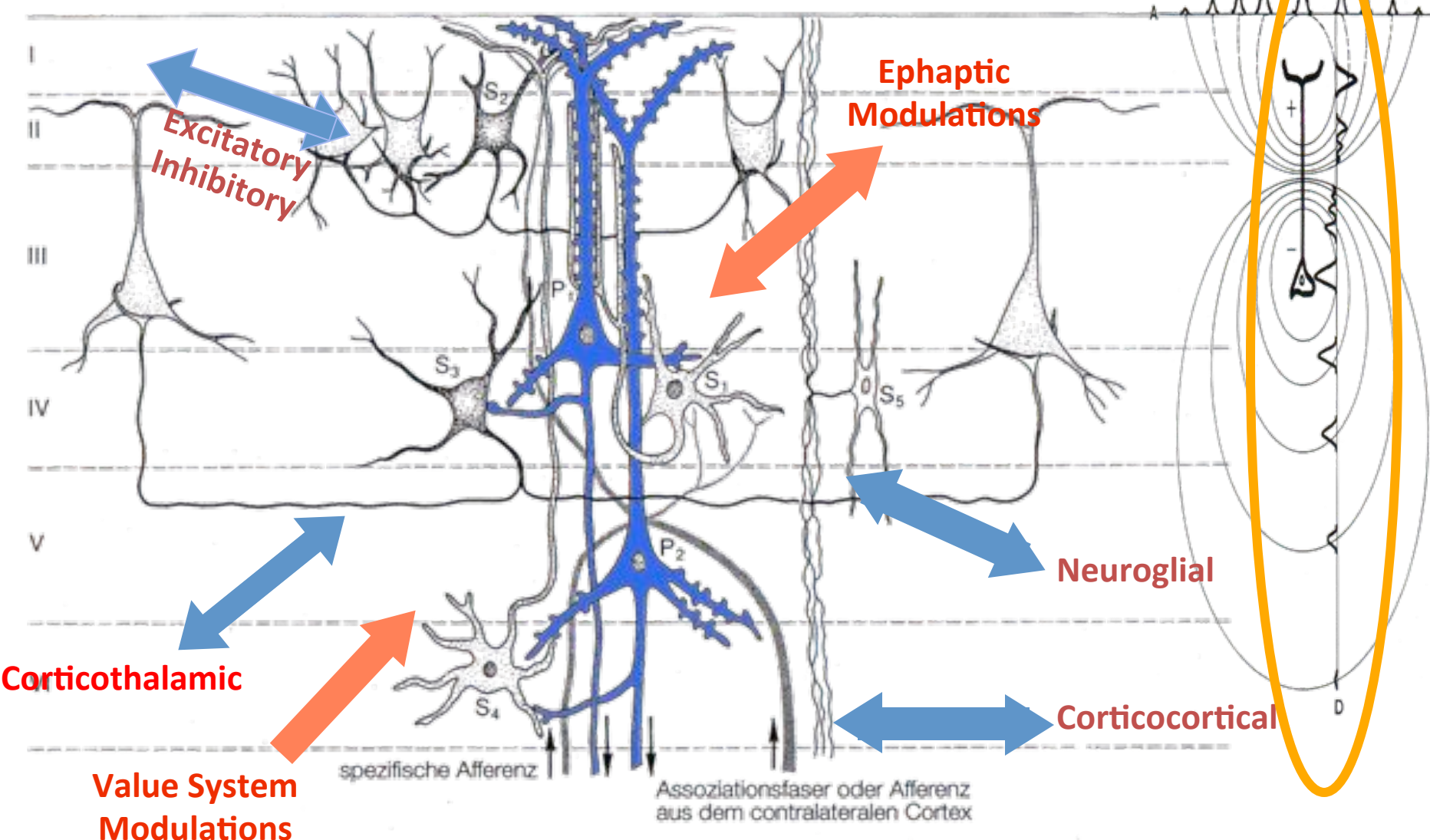
Larger



Smaller



The generation and modulation of EEG is COMPLEX and not well studied



Phase cones (Freeman)

Avalanches (Plenz)





Macro field dynamics are
spontaneous emergent
dynamic patterns – in both
space and cortex.





The spatiotemporal field
dynamics of cortex and brain
have not yet been imaged on
multiple spatial scales!

Functional Brain Imaging

Hemodynamic imaging

= imaging local brain

Energy

Direct 3-D inverse model,
but quite slow & indirect

Electromagnetic imaging

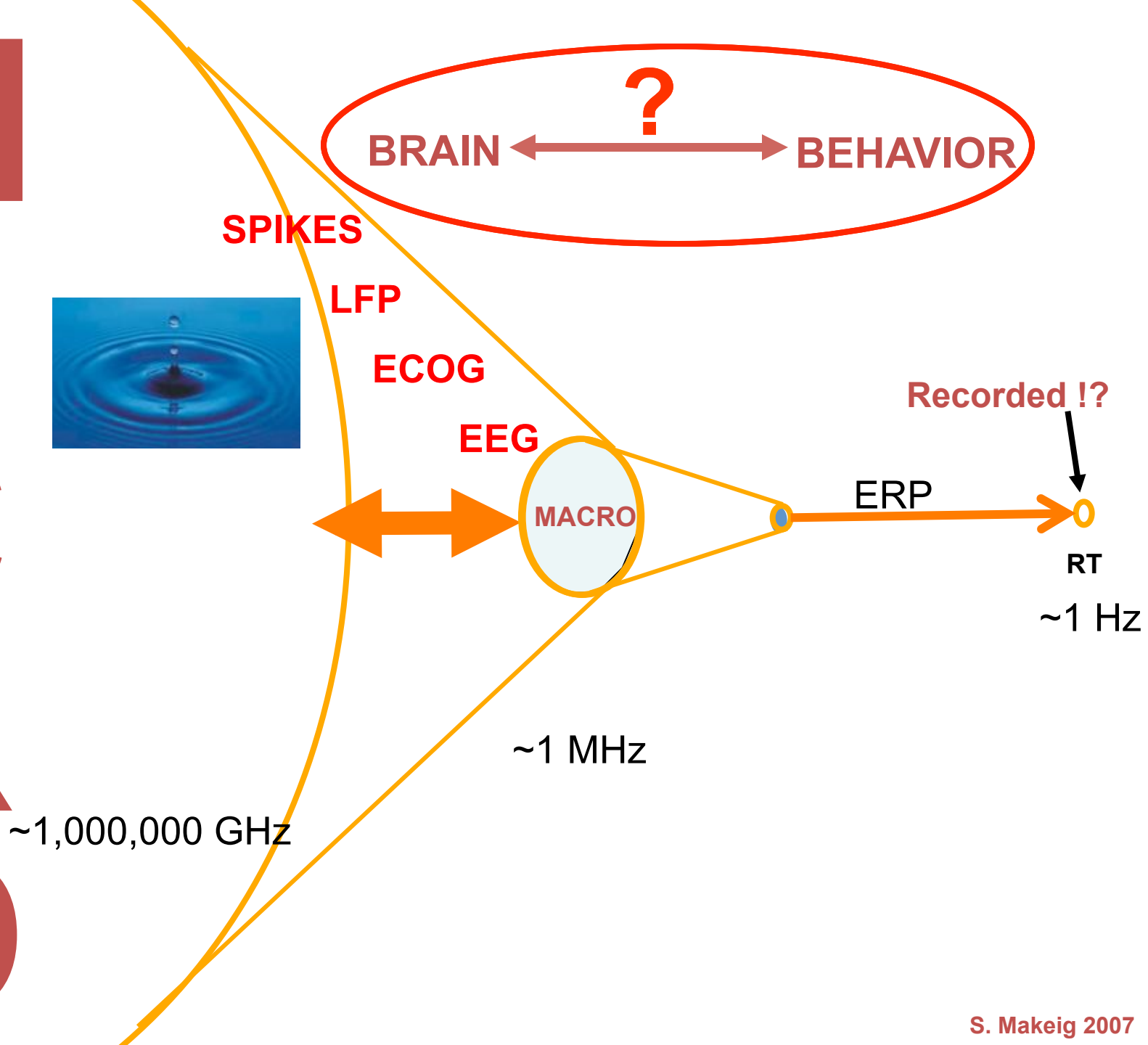
= imaging local cortical

Synchrony

3-D imaging requires model,
but quite fast & direct measure
of one aspect of neural activity.

How to measure EEG?

M I C R O



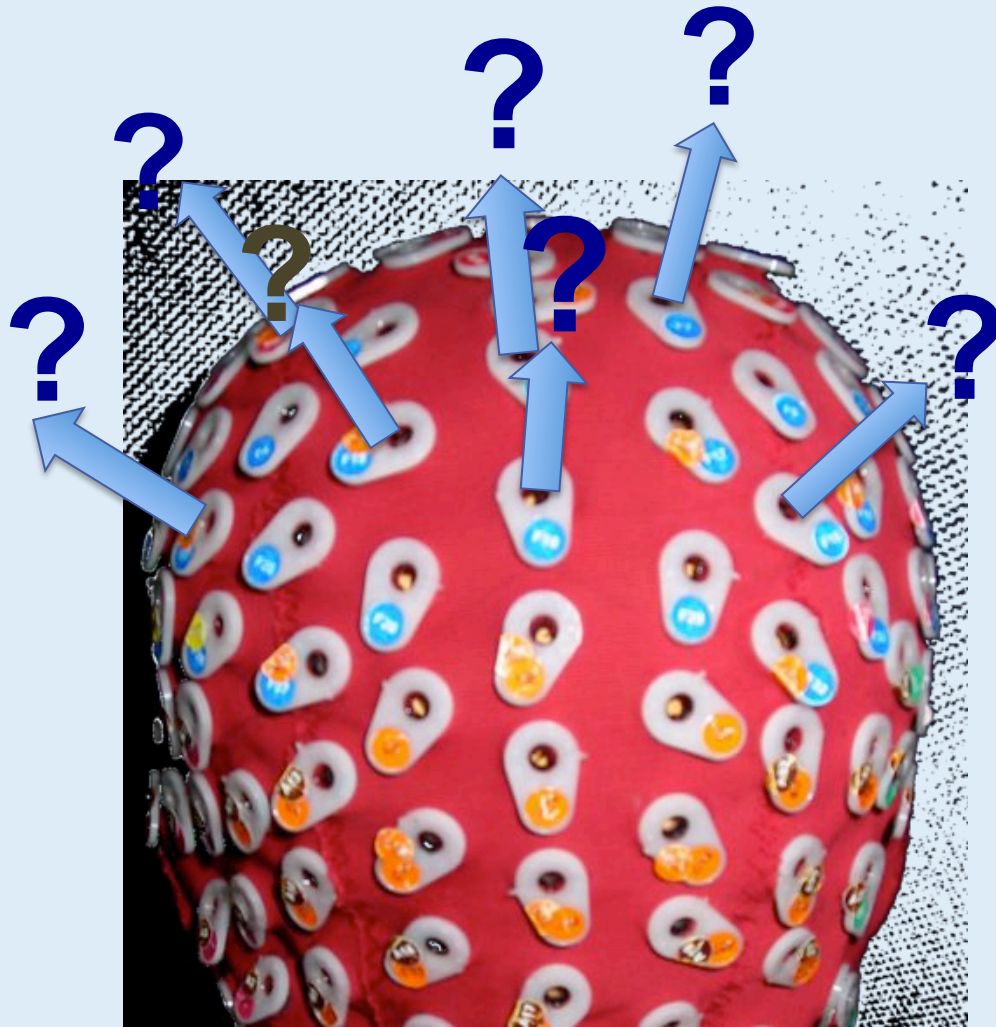


The diagram shows a cross-section of a brain with several electrodes placed on the surface. Labels include 'Local Synchrony' (circled in orange), 'Relative Independence' (circled in red), 'Cortex' (circled in blue), 'Electrodes' (circled in yellow), 'Skin' (circled in green), and 'Skull' (circled in grey). Arrows indicate the path of signals from the cortex through the skull and skin to the electrodes.

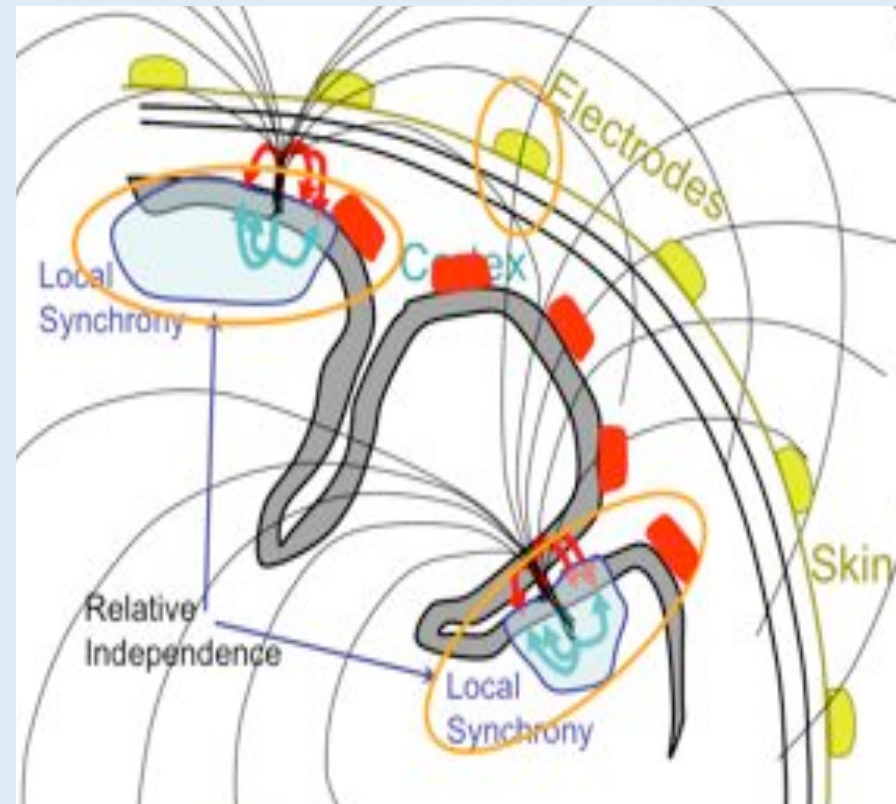
Brain EEG vs Scalp EEG

scalp signals \neq source signals !

Naïve 2-D interpretation of EEG signals?



Cortical EEG signal projection patterns as point processes



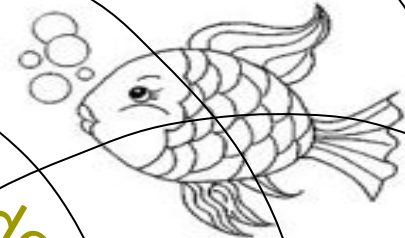
Actual cortical source volume conduction patterns (cartoon)



Local Synchrony

Cortex

Electrodes



Relative Independence

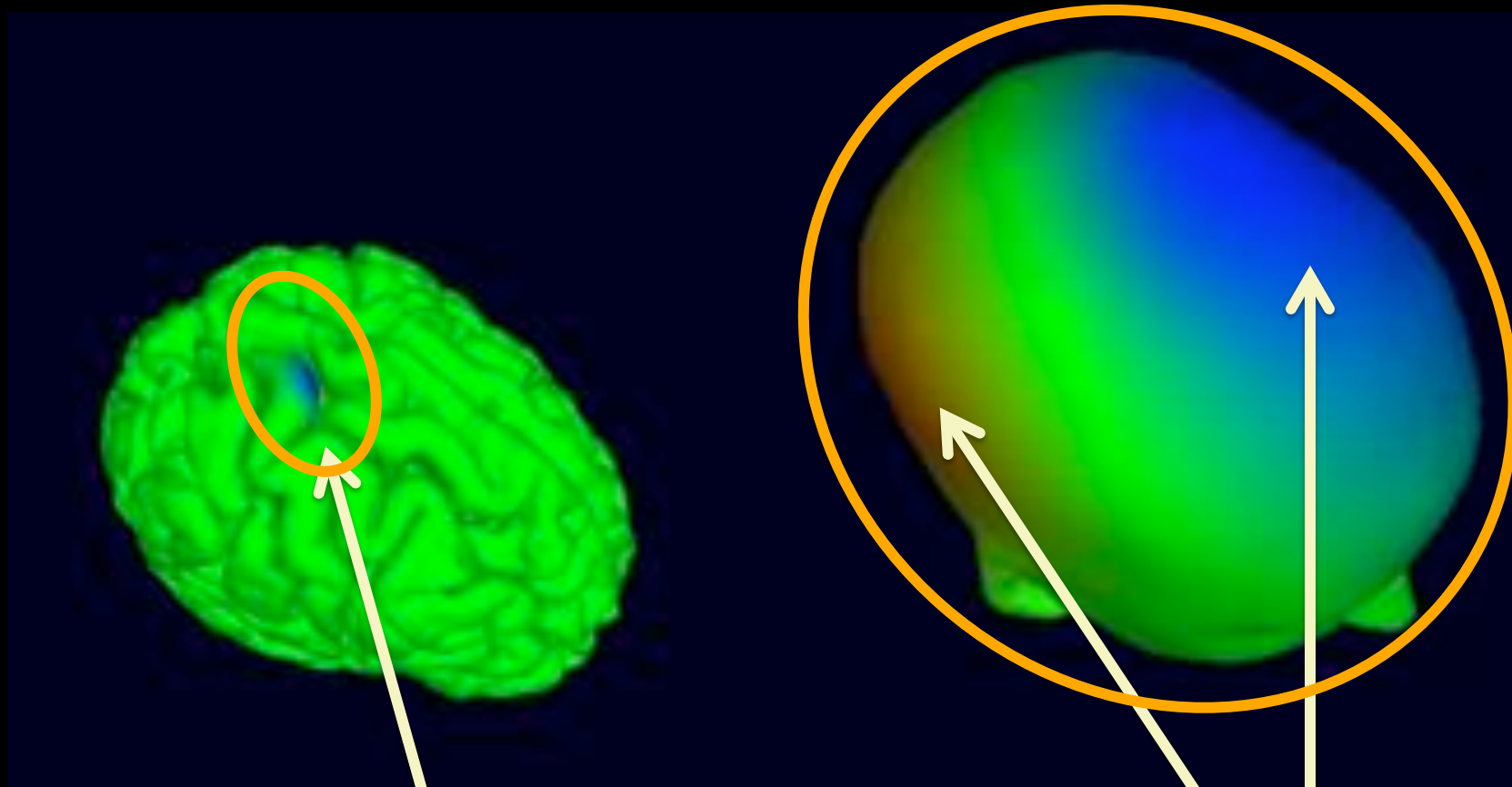
Local Synchrony

Skin

Skull

scalp signals \neq source signals !

The very broad EEG point-spread function



Simulated parietal source

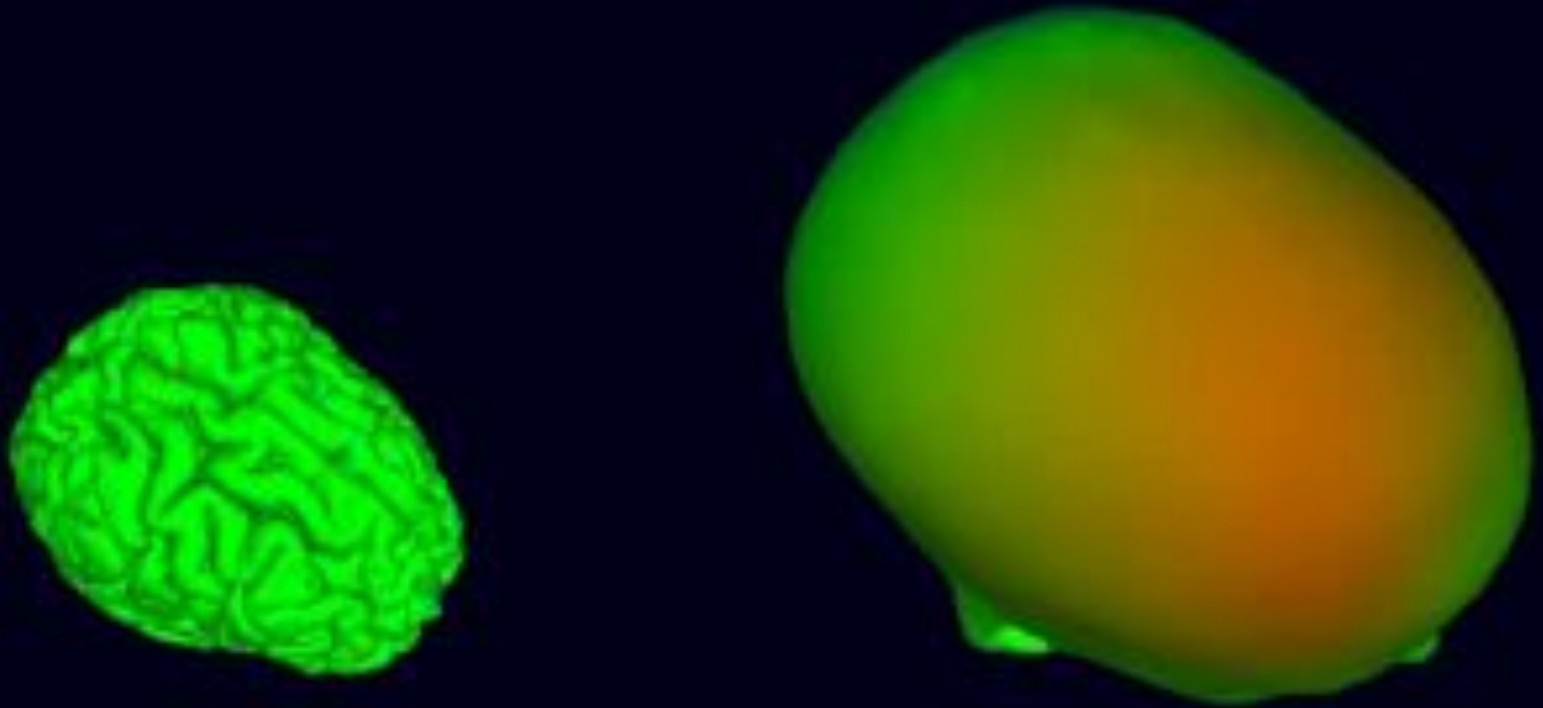
Very broad projected scalp potentials

The very broad EEG point-spread function

[Nsources_alpha.mp4]

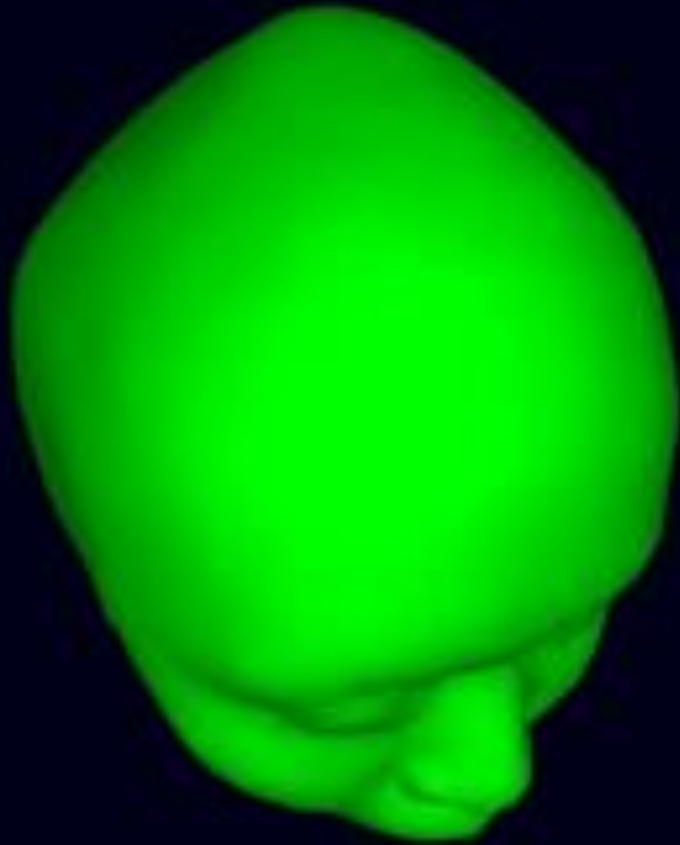
Simulated EEG summing cortical sources
(animation at 1/5th real time)

The very broad EEG point-spread function

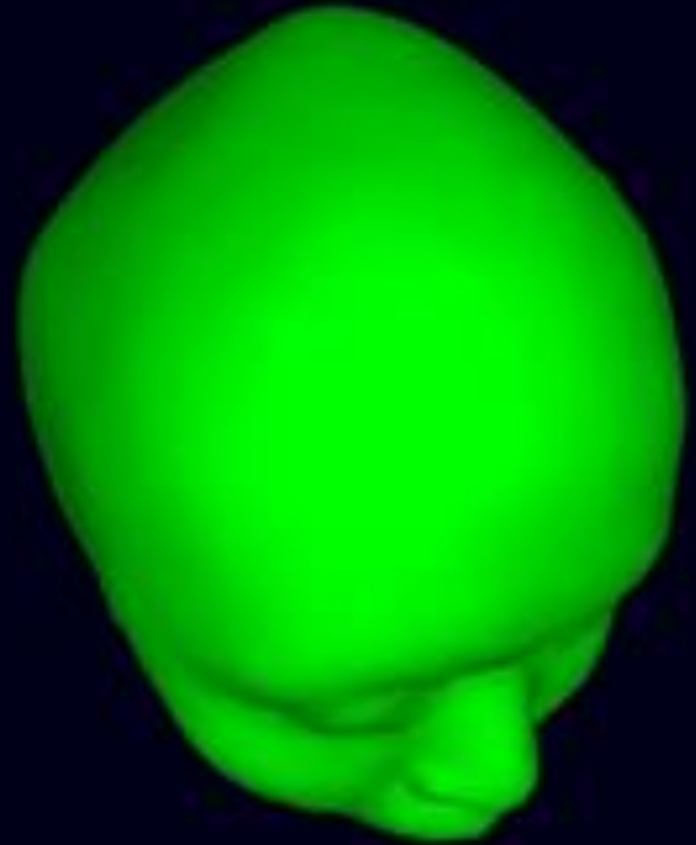


Simulated EEG summing 30 cortical sources
(animation at 1/5th real time)

Effects of non-brain artifacts on scalp EEG



Without non-brain sources

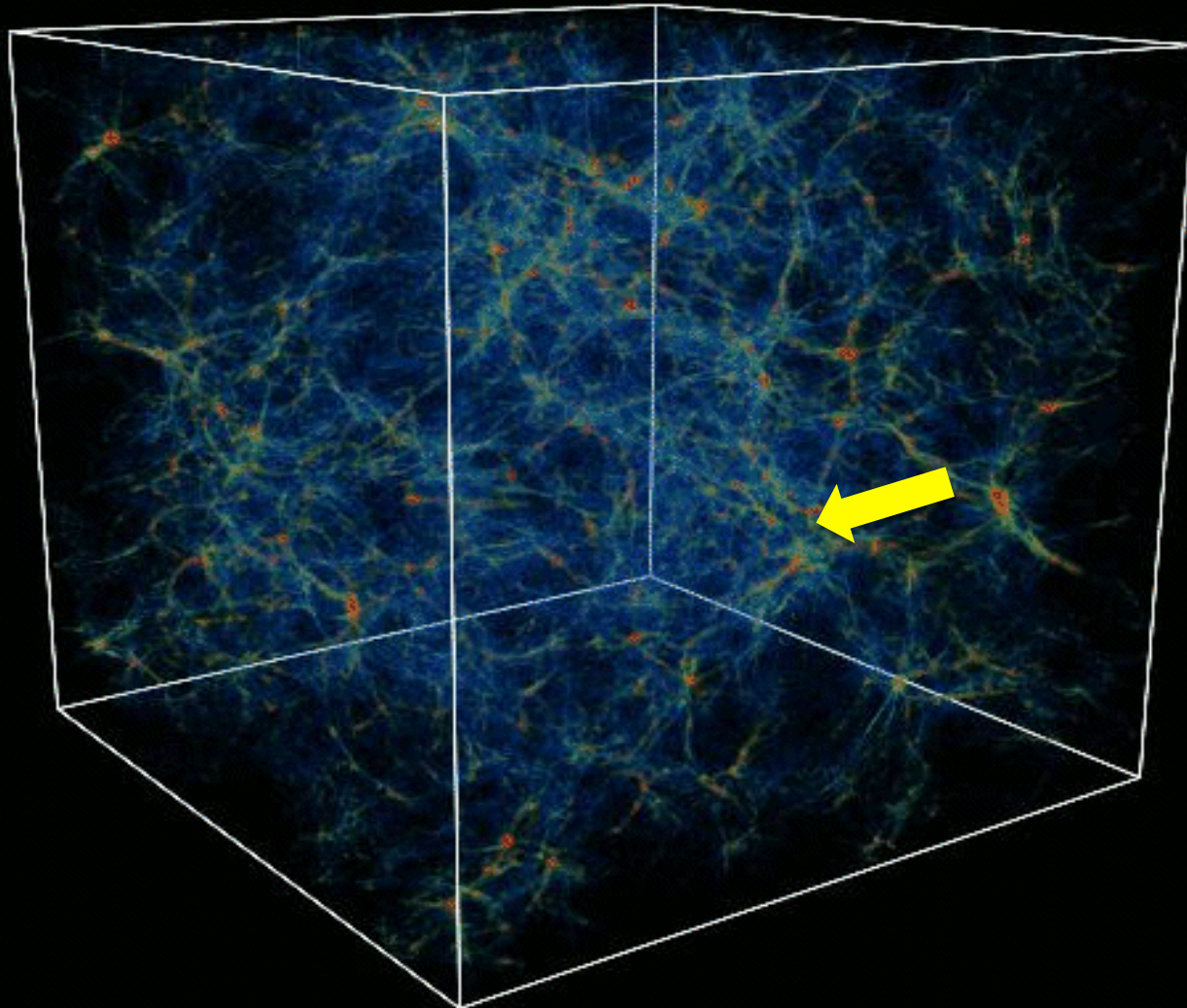


Including non-brain sources

The 2-D Dome of the Sky



3-D structure of the Universe



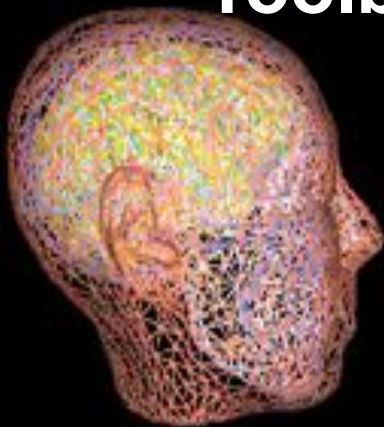


Neuroelectromagnetic Forward Head Modeling Toolbox (NFT)

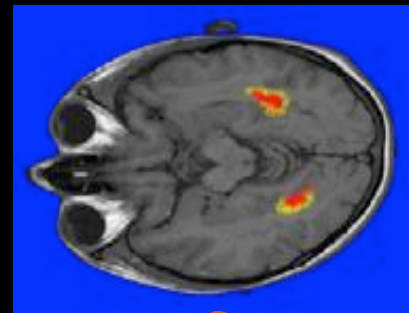
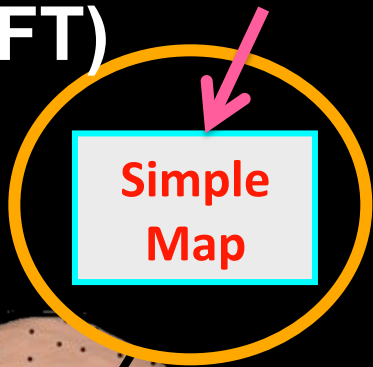
BUT how to find a 'simple' map representing the projection of a single cortical source?

Toolbox (NFT)

Solve the forward problem using realistic head models (BEM)



Mesh generation



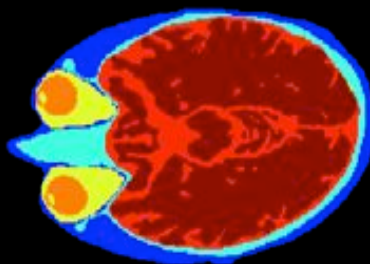
Source Image



Signal Processing



MRI



Segmentation



EEG/MEG

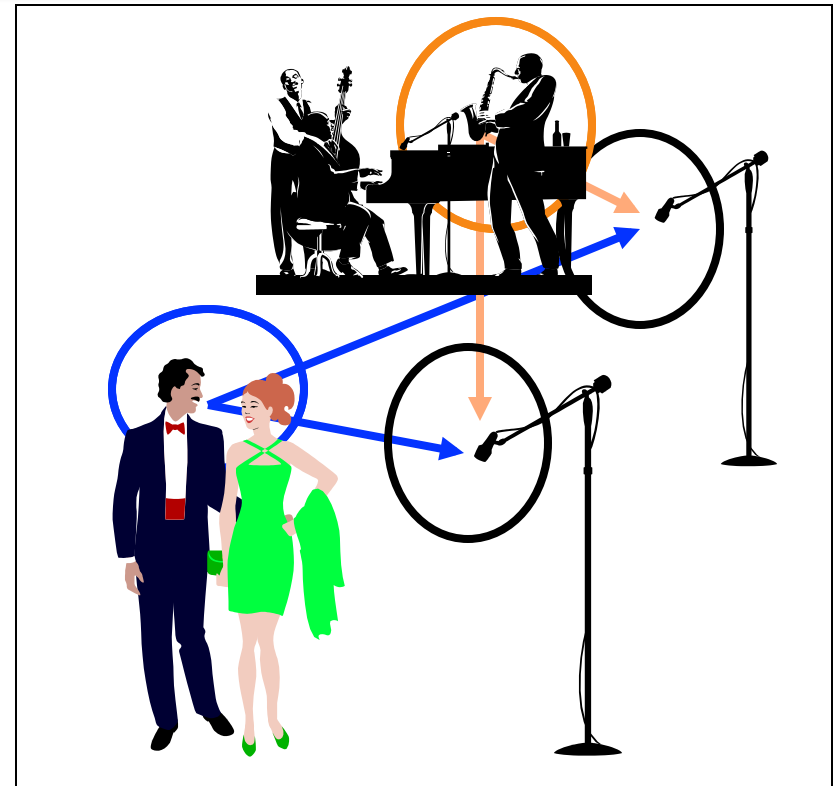
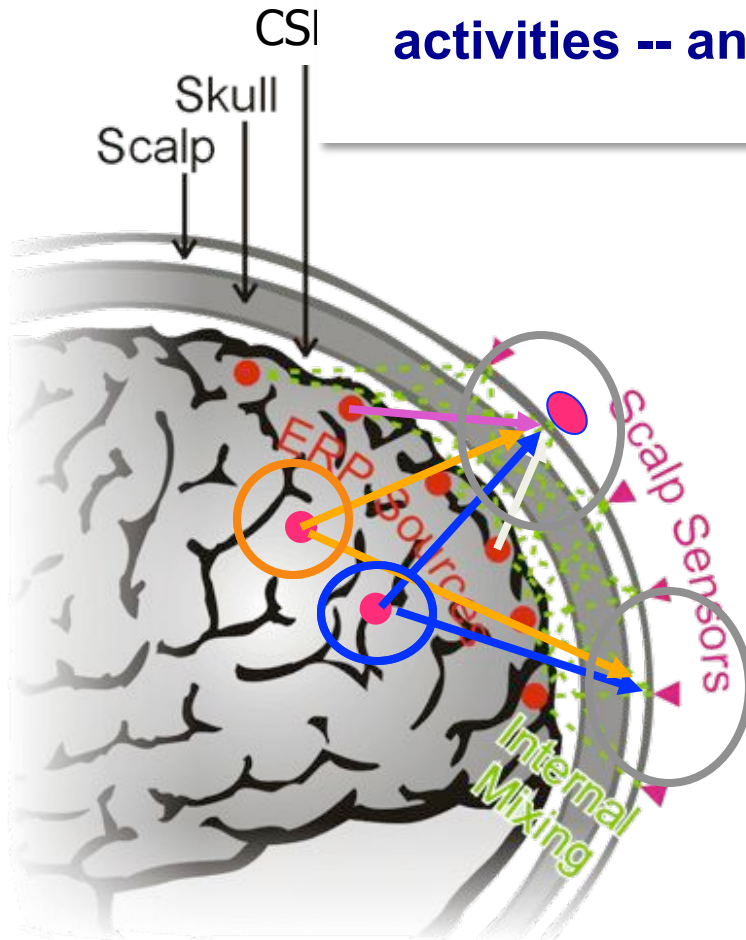
Information based signal processing

Blind EEG Source Separation by Independent Component Analysis



Tony Bell,
developer of
Infomax ICA

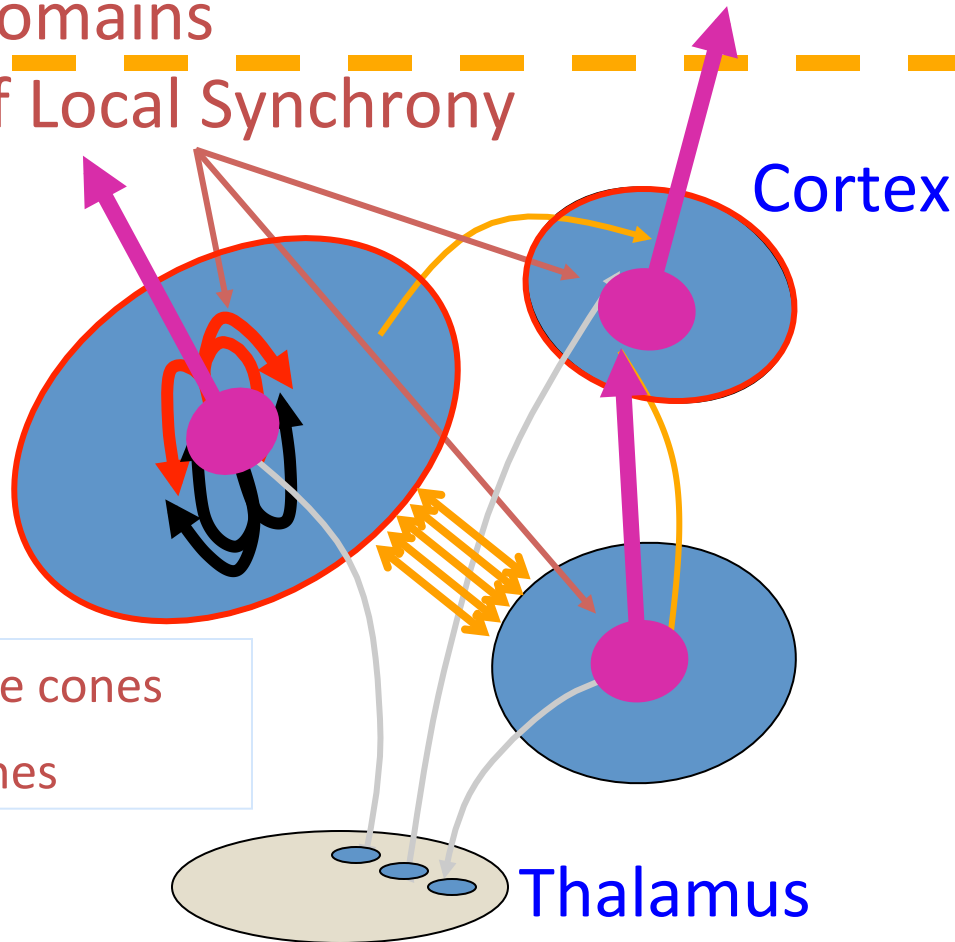
ICA can find distinct EEG source activities -- and their 'simple' scalp maps!



Are EEG source outputs (near) independent?

**Independent
Domains**

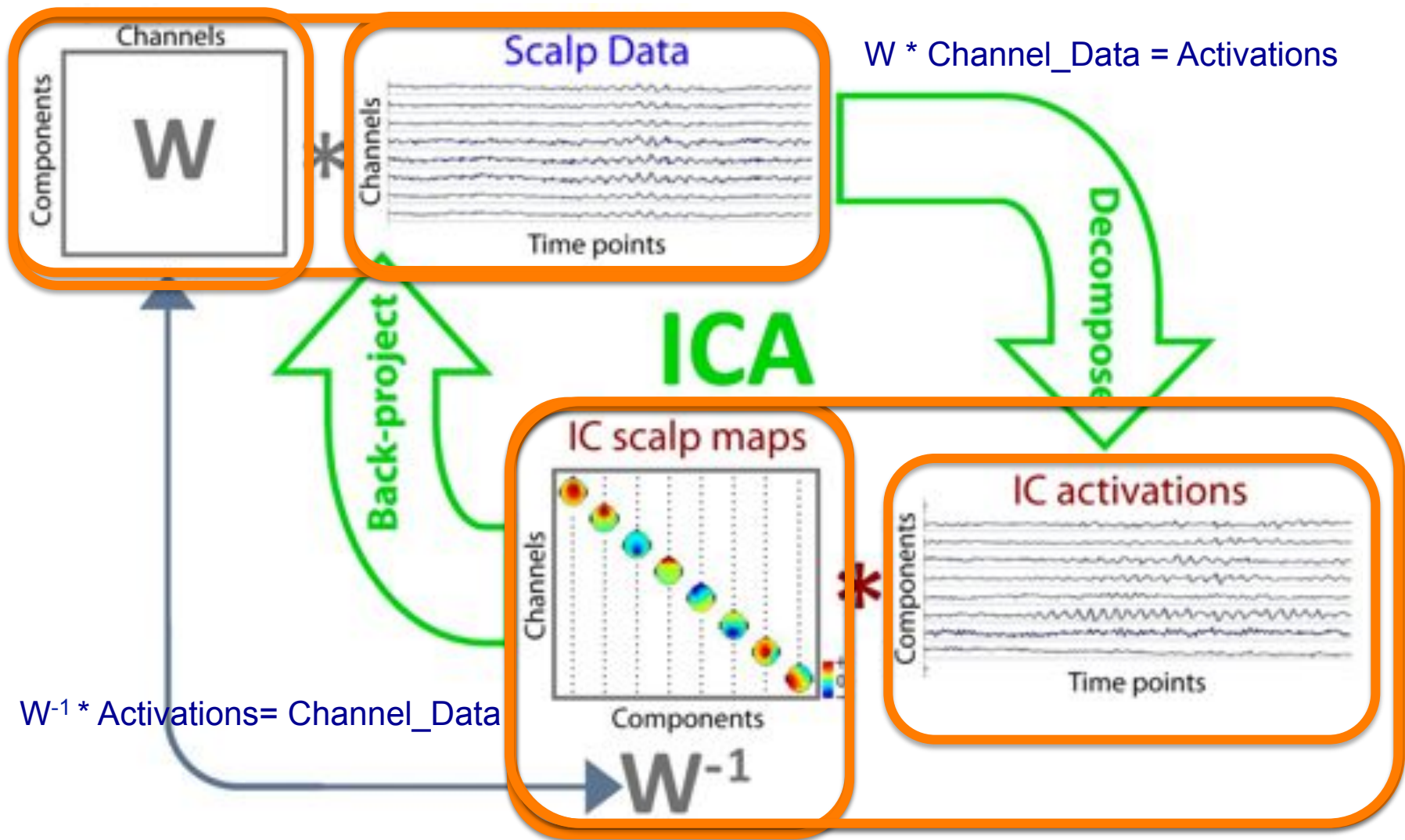
of Local Synchrony



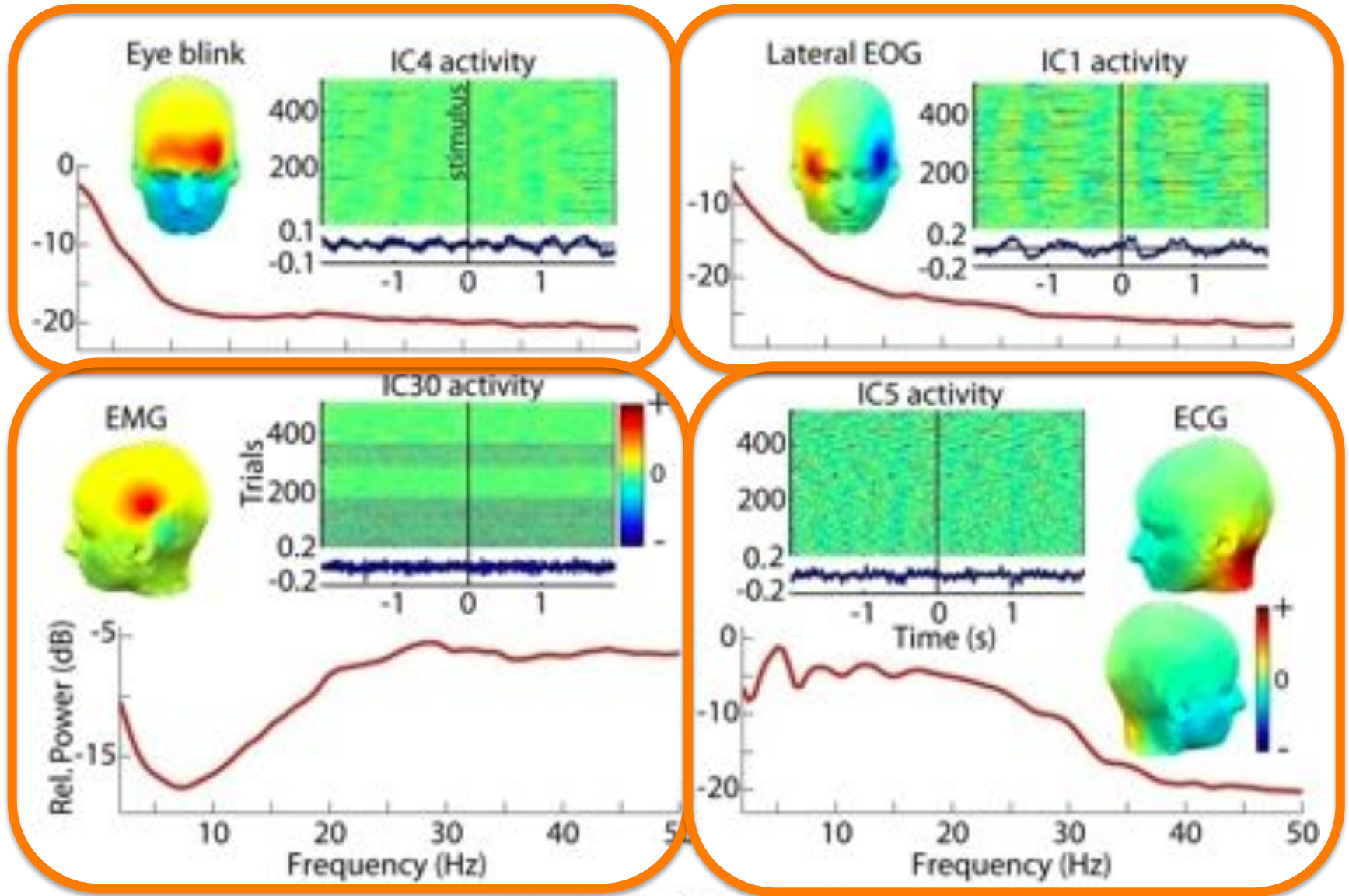
Freeman - phase cones

Plenz - avalanches

ICA is a linear data decomposition method

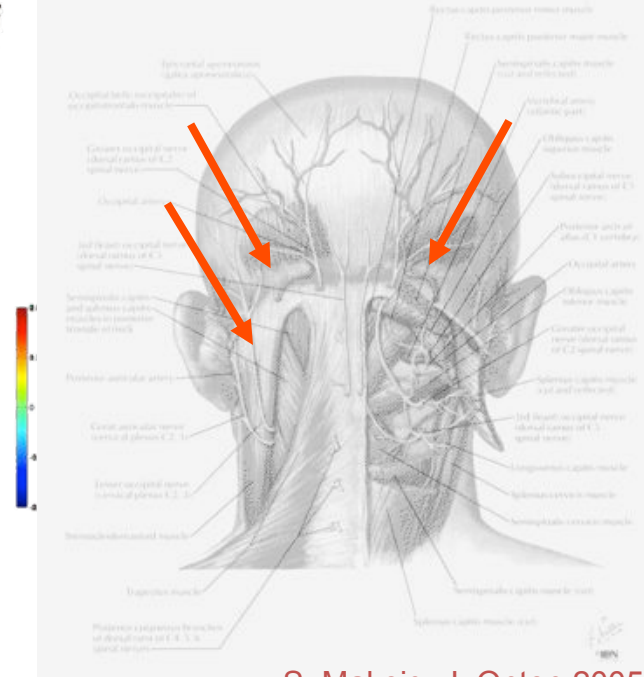
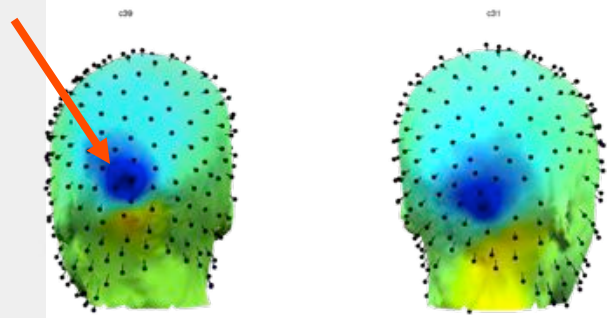
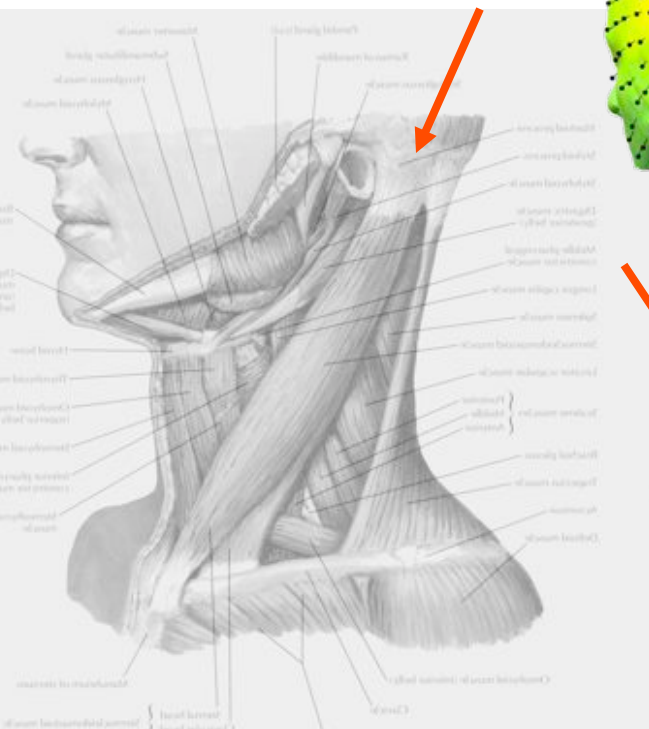
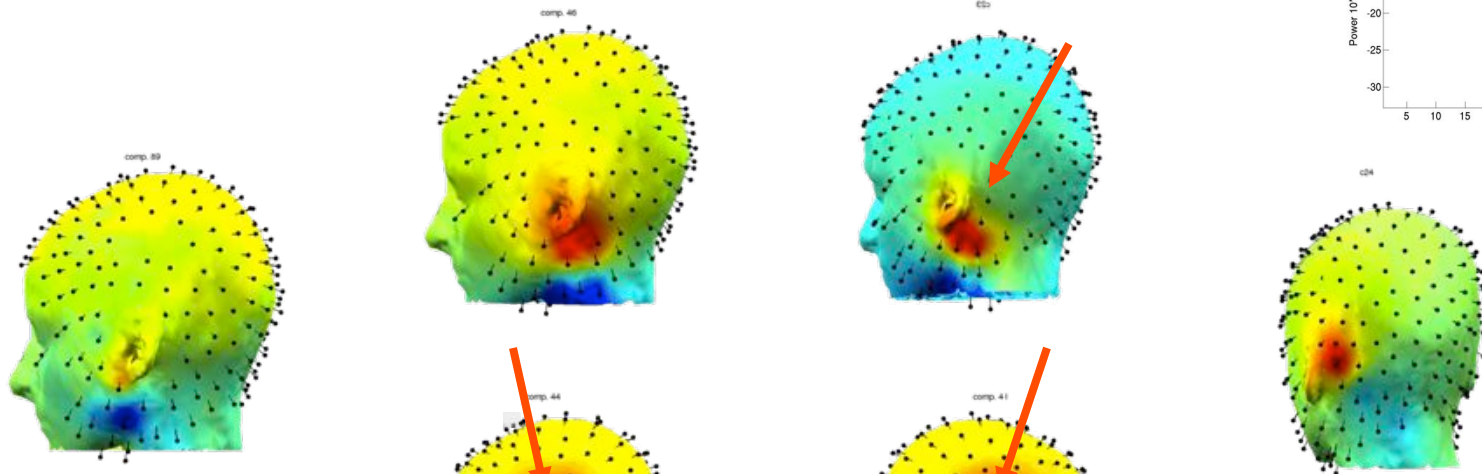
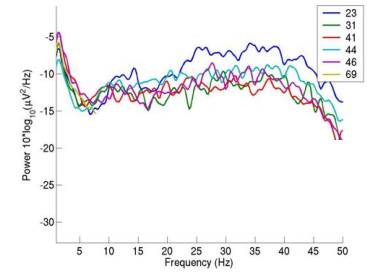


ICA finds Non-Brain Independent Component (IC) Processes ...

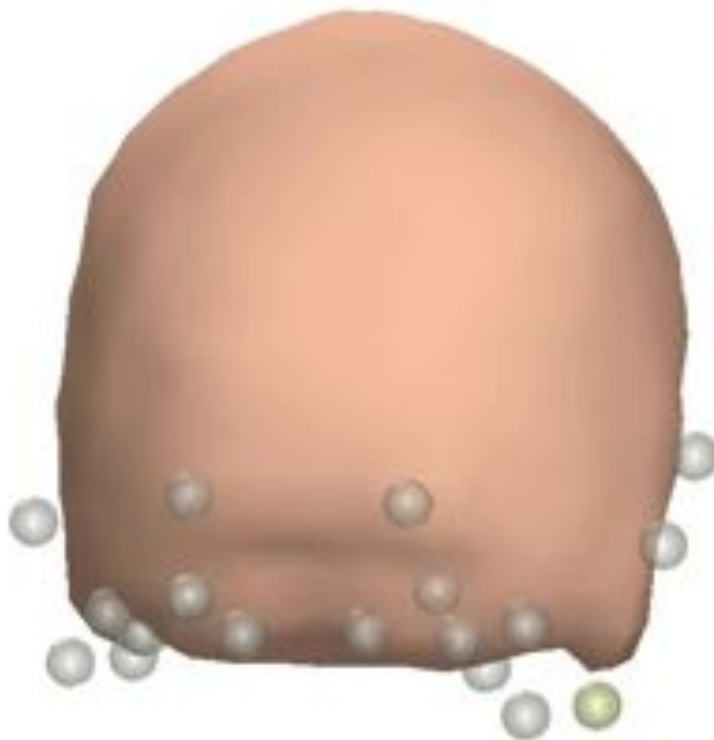


... separates them from the remainder of the data ...

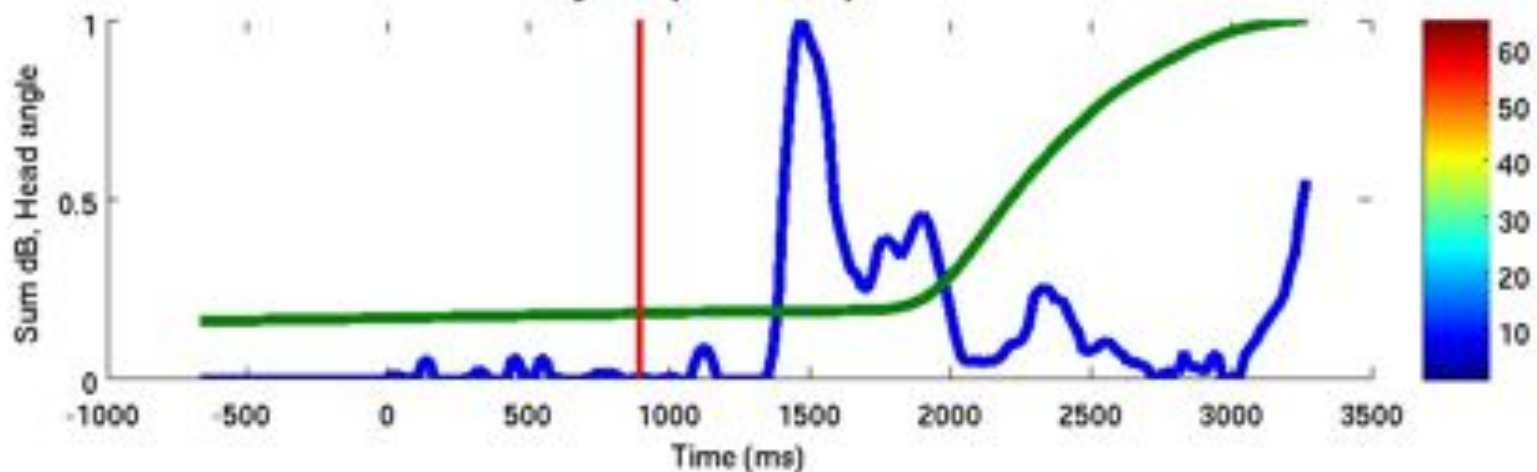
Independent muscle signals



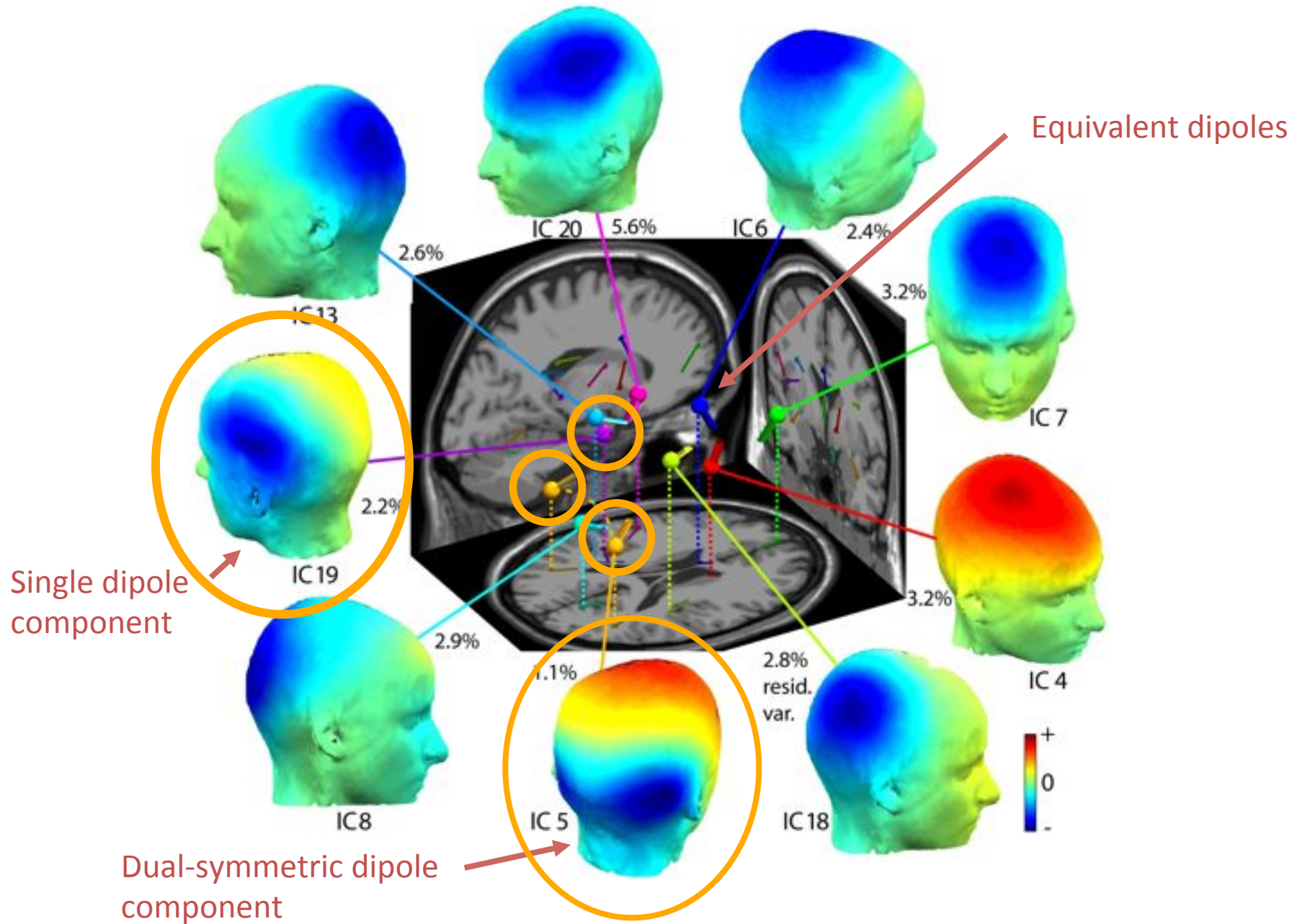
Distributed neck muscle & movement dynamics

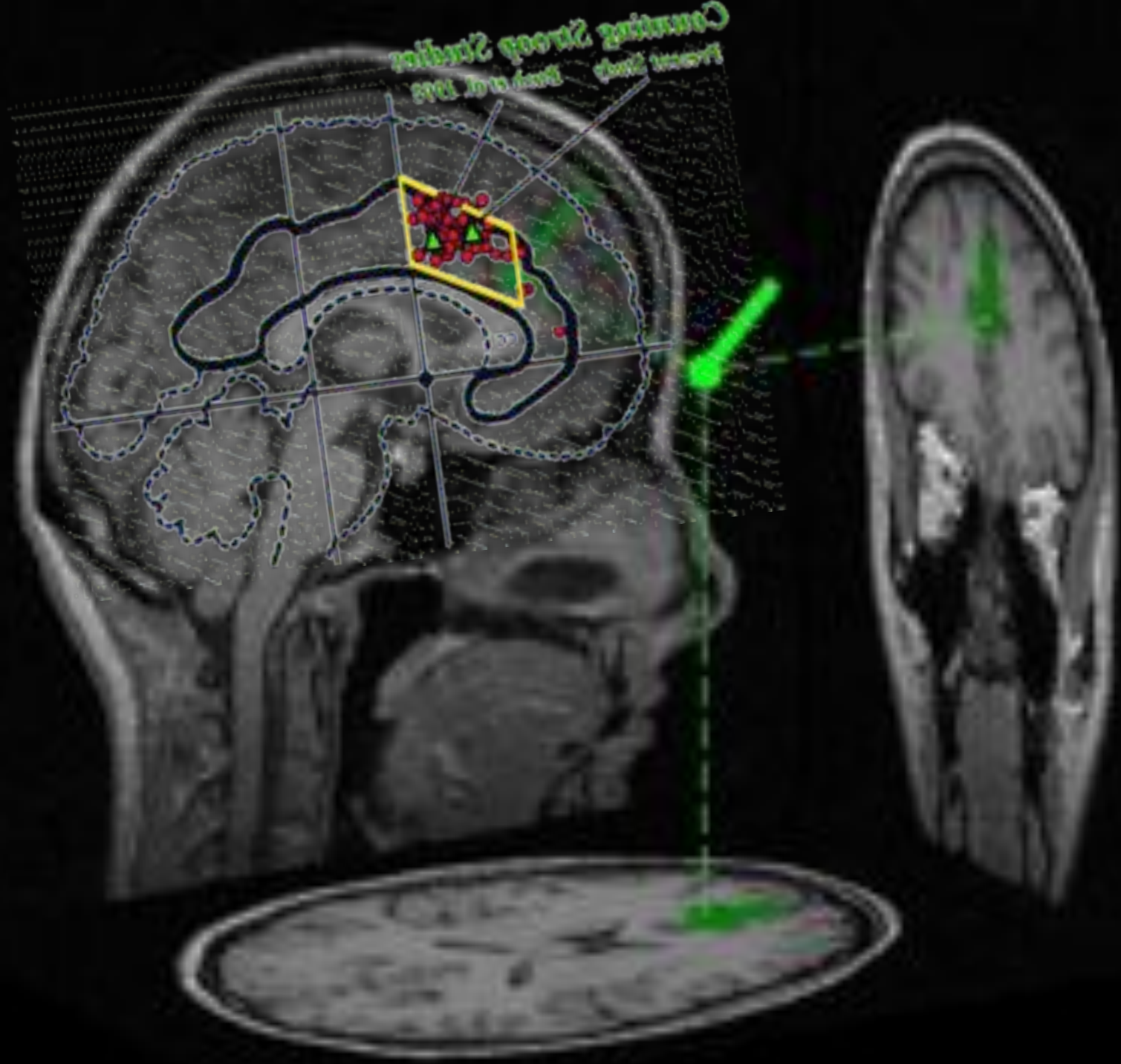


Subject pb08, epoch 4



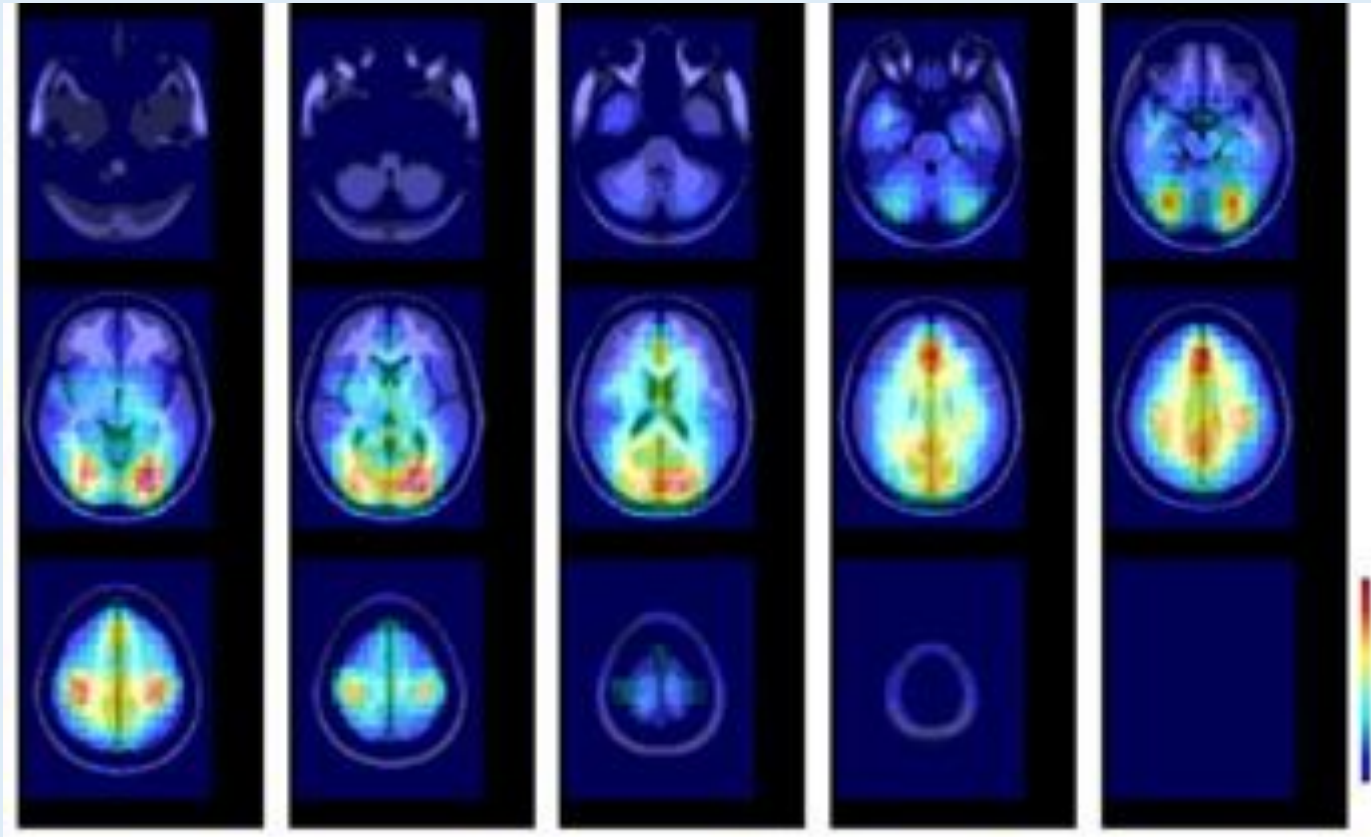
... and also separates cortical brain IC processes





Equivalent dipole density

Visual Working Memory



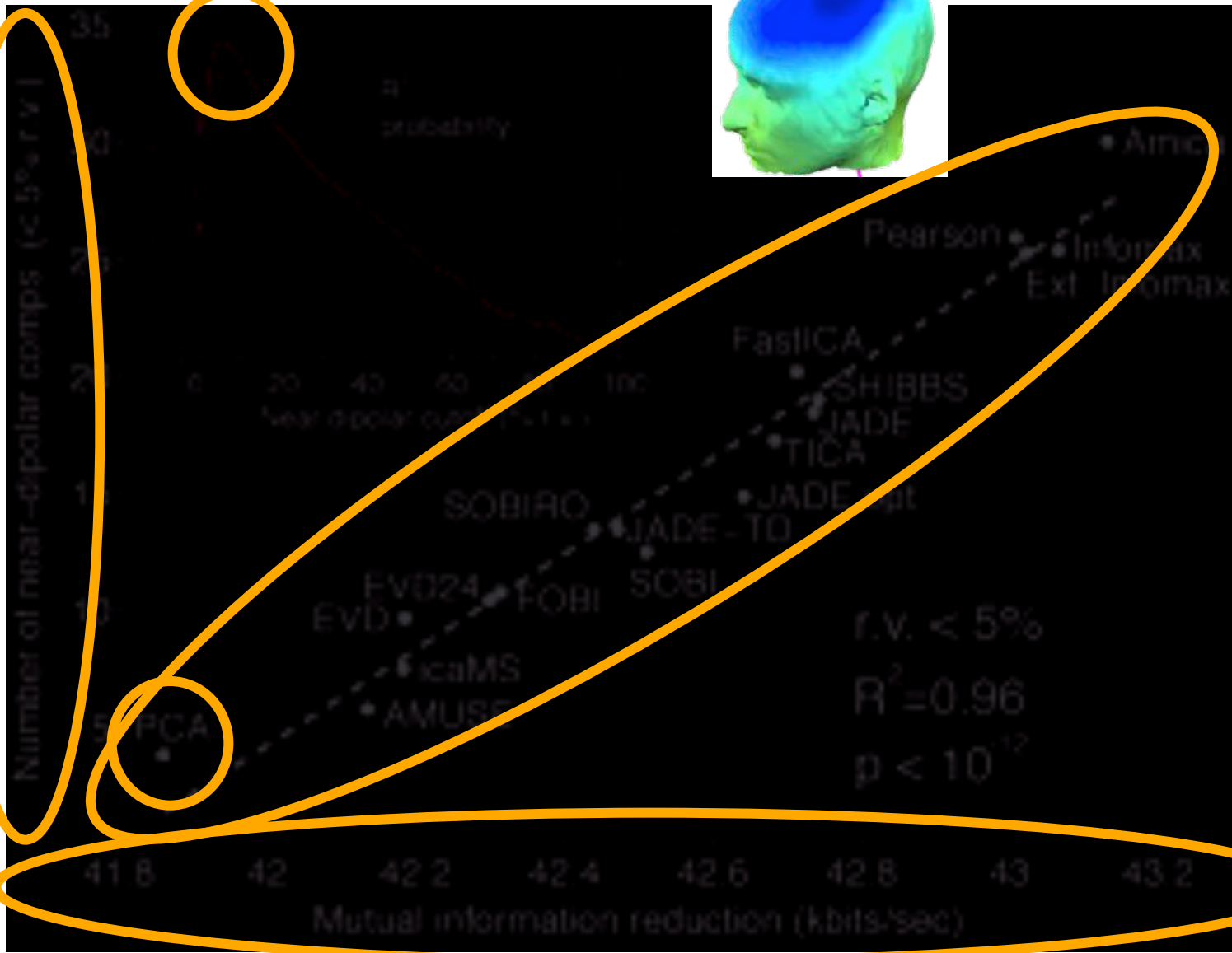
Sternberg
letter
memory
task

Important Result

Those linear decompositions of multi-channel EEG data that find ICs whose time courses are **more** temporally **independent**

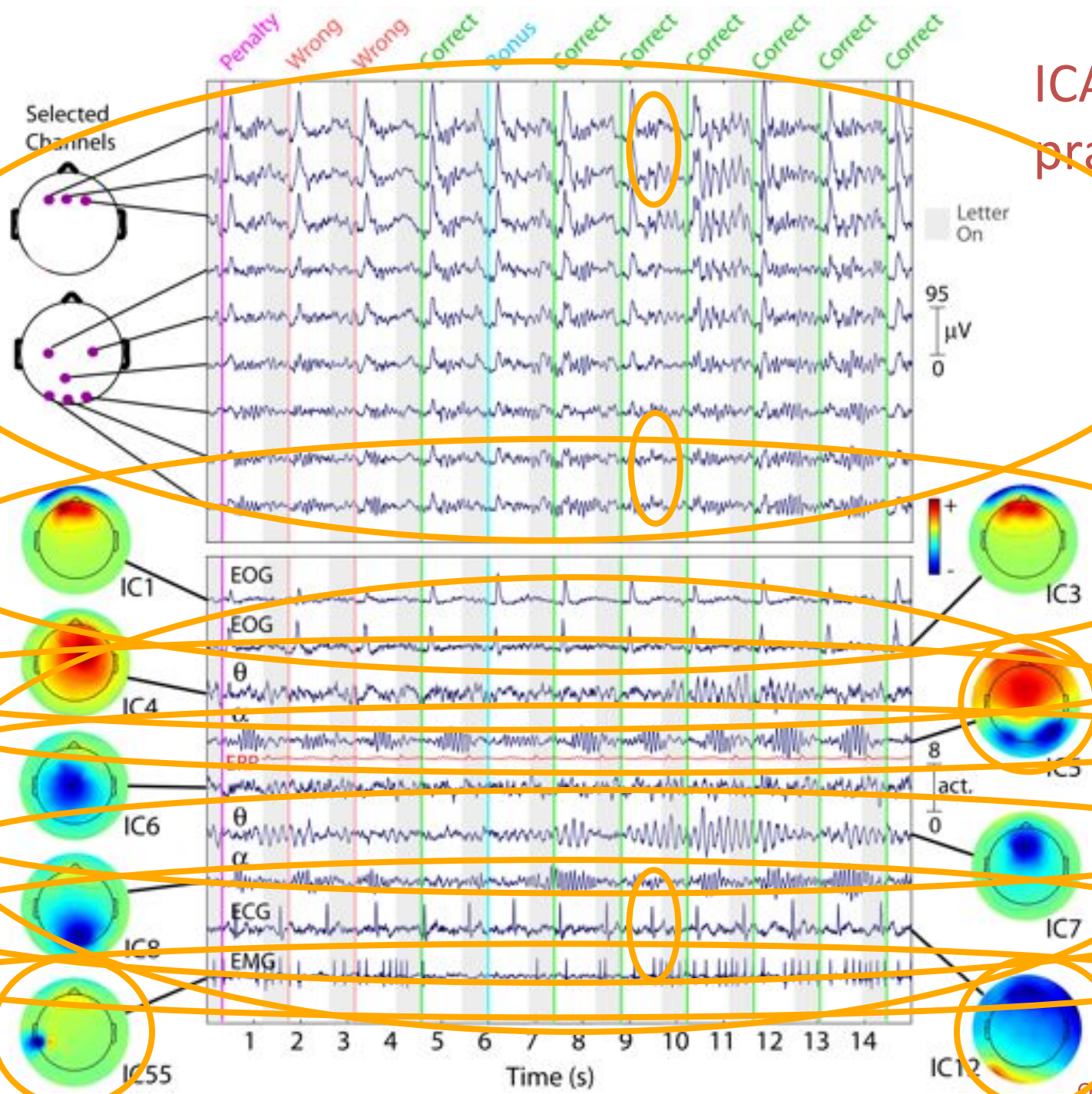
Also find more ICs whose scalp maps are highly **'dipolar'** – i.e., ICs compatible with the spatial projection of a single cortical (or else non-brain, artifactual) source process.

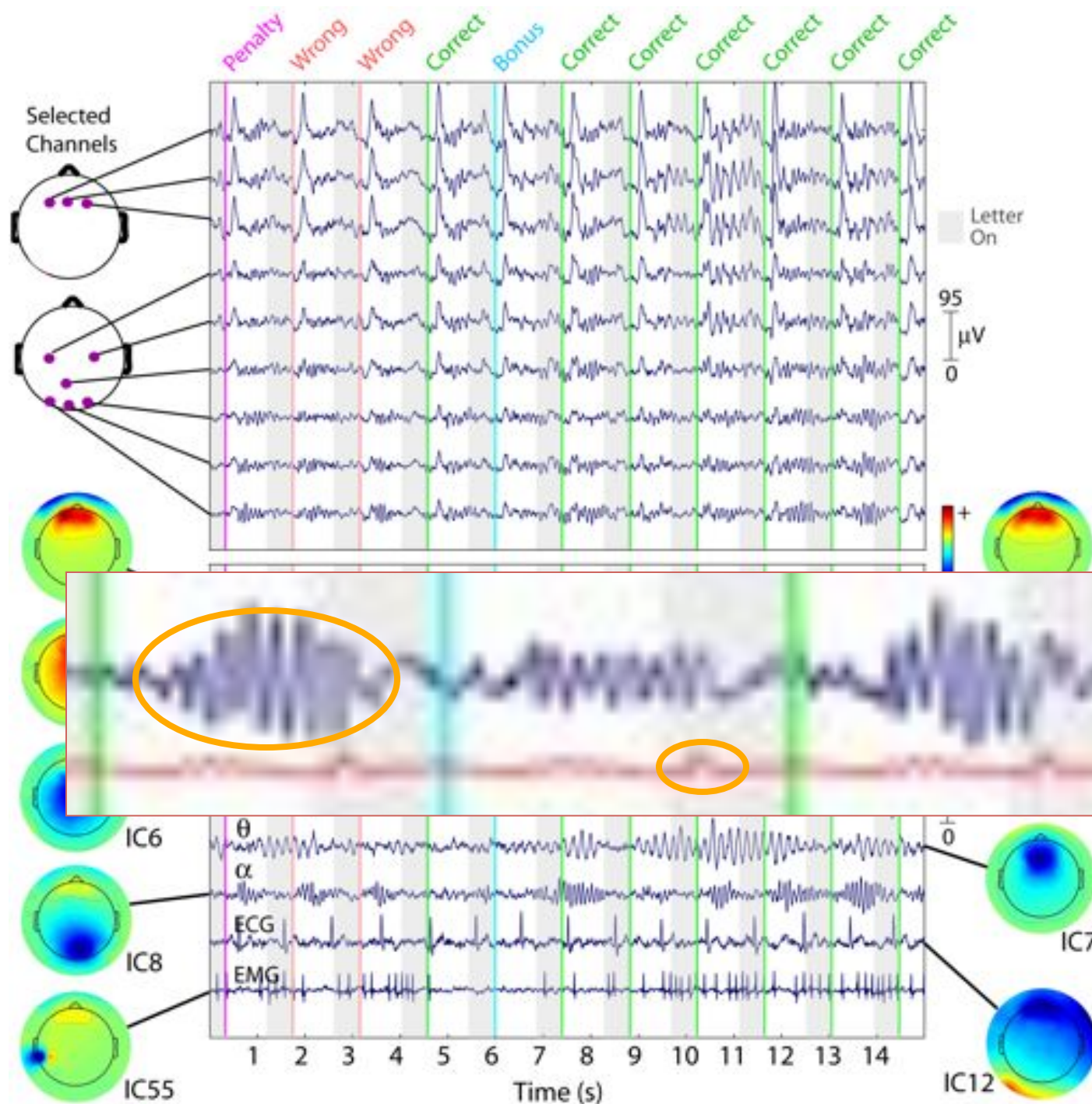
Delorme et al., *PLOS One*, 2012



Delorme et al., *PLOS One*, 2012

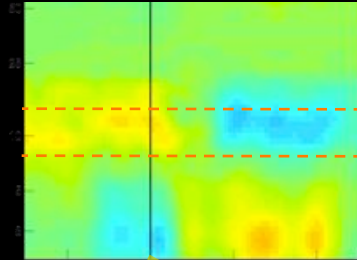
ICA in practice



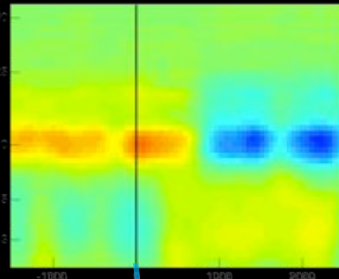


BCILAB Toolbox

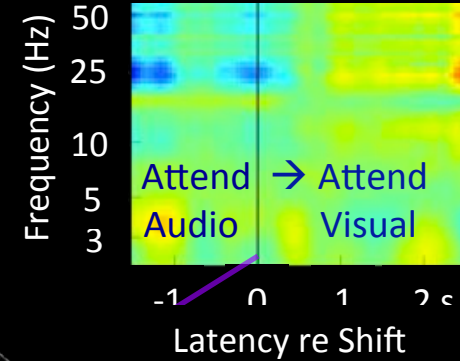
BA 19, 30, 18, Associative (V3) & Secondary (V2) visual



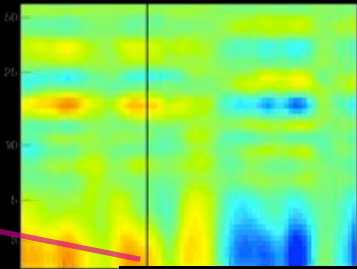
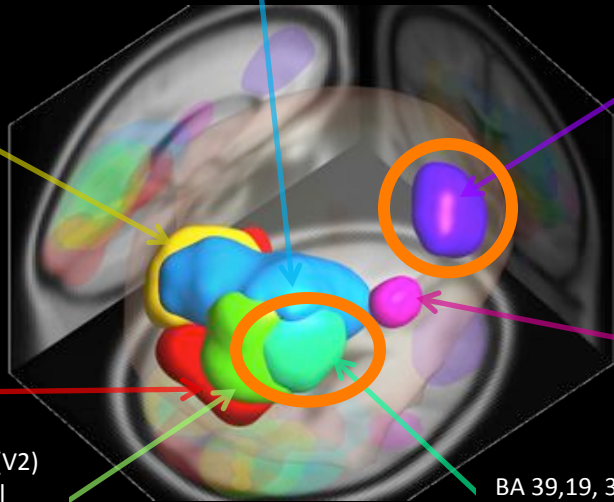
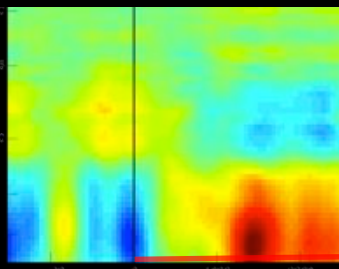
BA 31,18, 23, visual



BA 9,8, includes frontal eye field

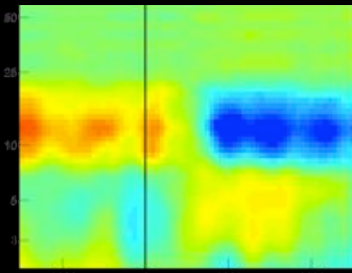


BA 18, 17, Secondary (V2) and Primary (V1) visual

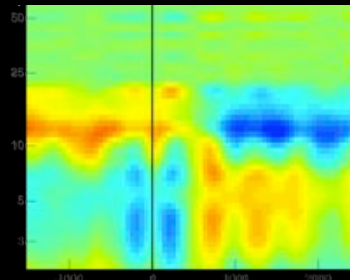


BA 3, 43, 4, 40, Primary Somatosensory and Motor

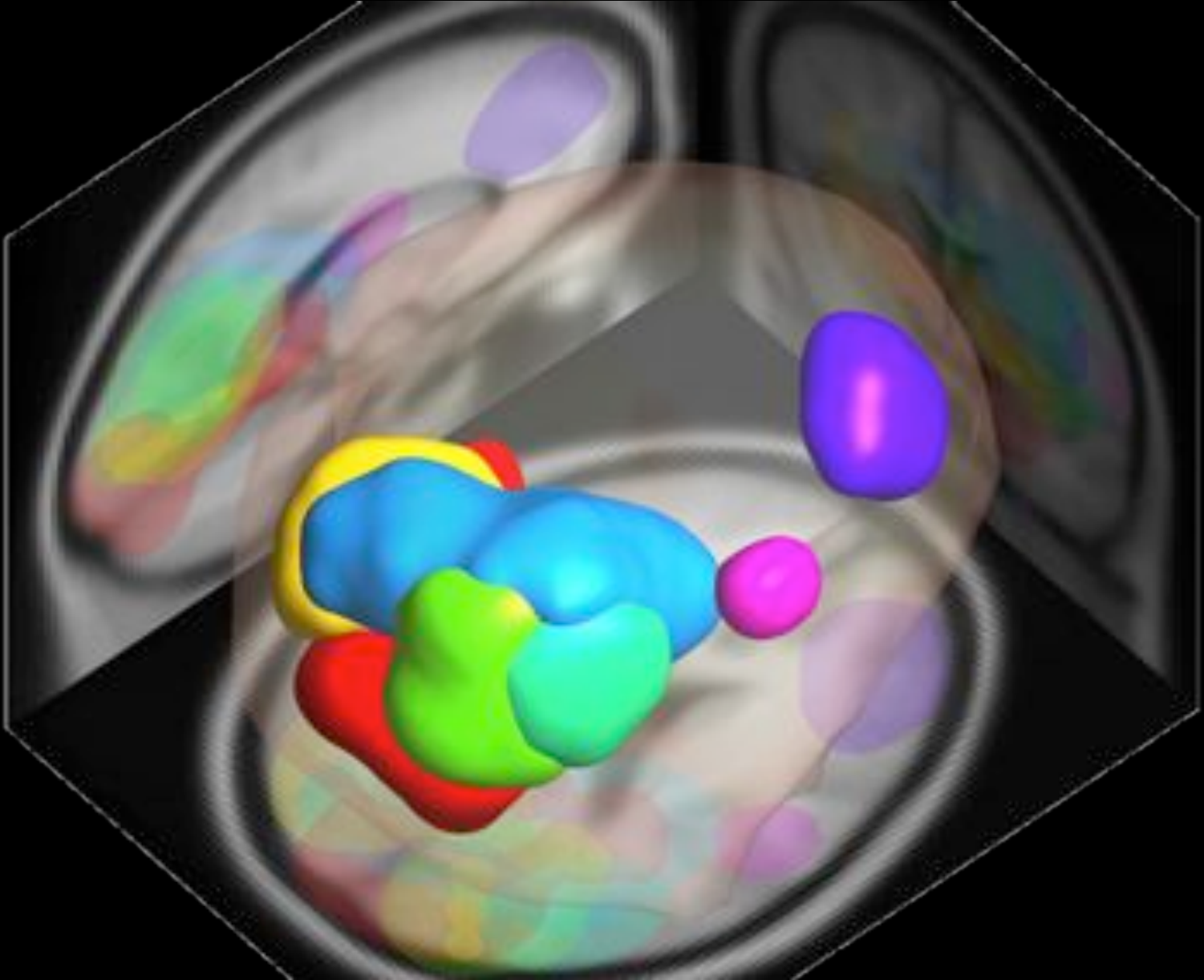
BA 18, 19, 30, Secondary (V2) and Associative (V3) visual



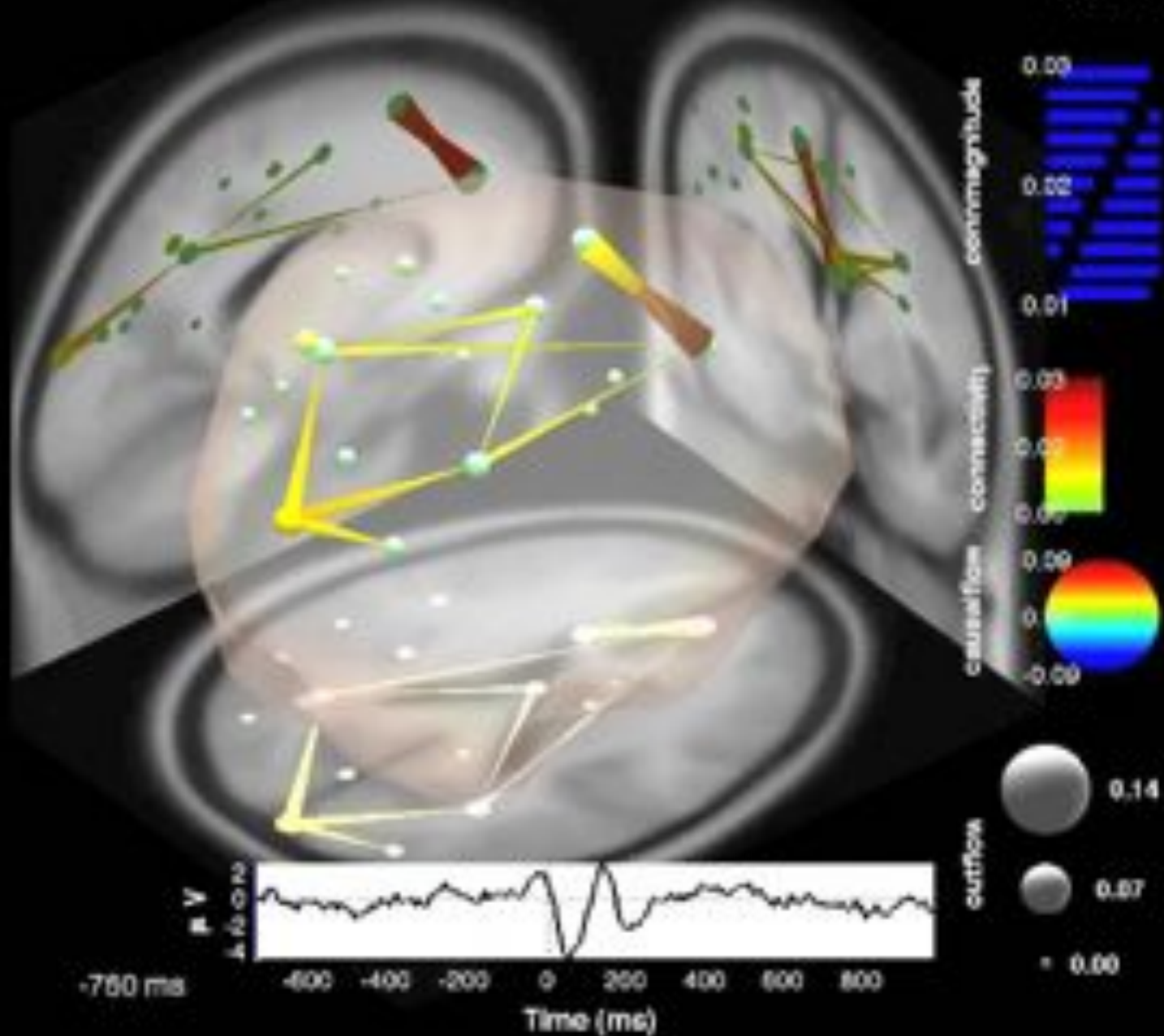
BA 39,19, 37, Associative visual (V3)



Measure Projection Toolbox (MPT)



Source Information Flow Toolbox (SIFT)





Questions please!