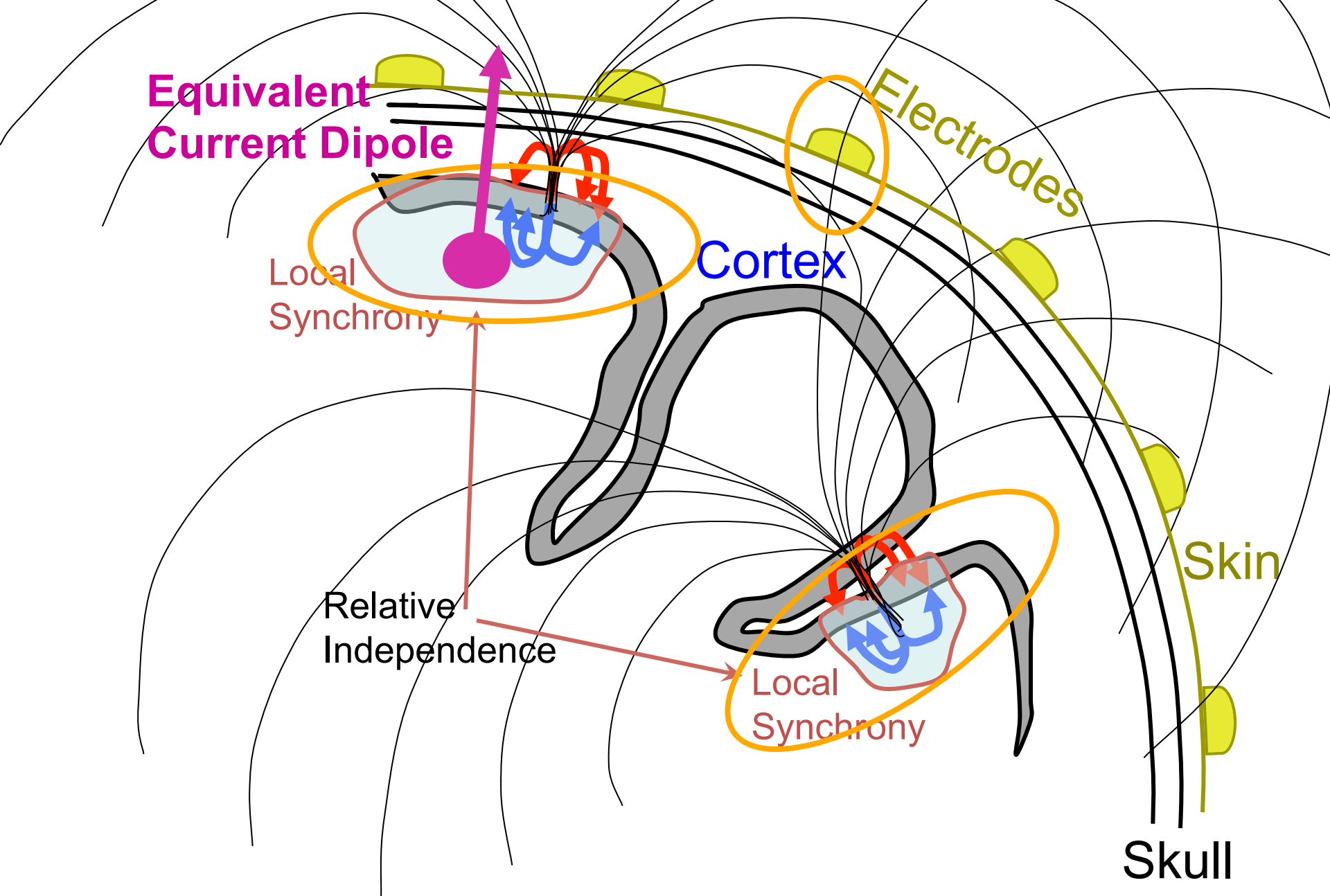


Forward and Inverse EEG Source Modeling using NFT – The Neuroelectromagnetic Forward Head Modeling Toolbox



Scott Makeig & Zeynep Akalin Acar
Institute for Neural Computation
UCSD, La Jolla CA

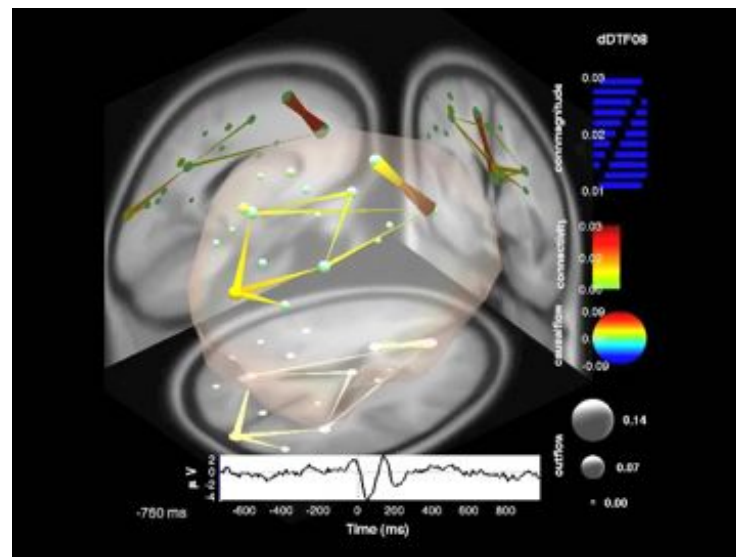


Source-Resolved EEG Brain Imaging

Source-Resolved EEG Brain Imaging

EEG data collection is

- Non-invasive
- Wearable
- Mobile
- Cheap

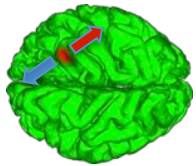


BUT + source imaging requires an electrical head model

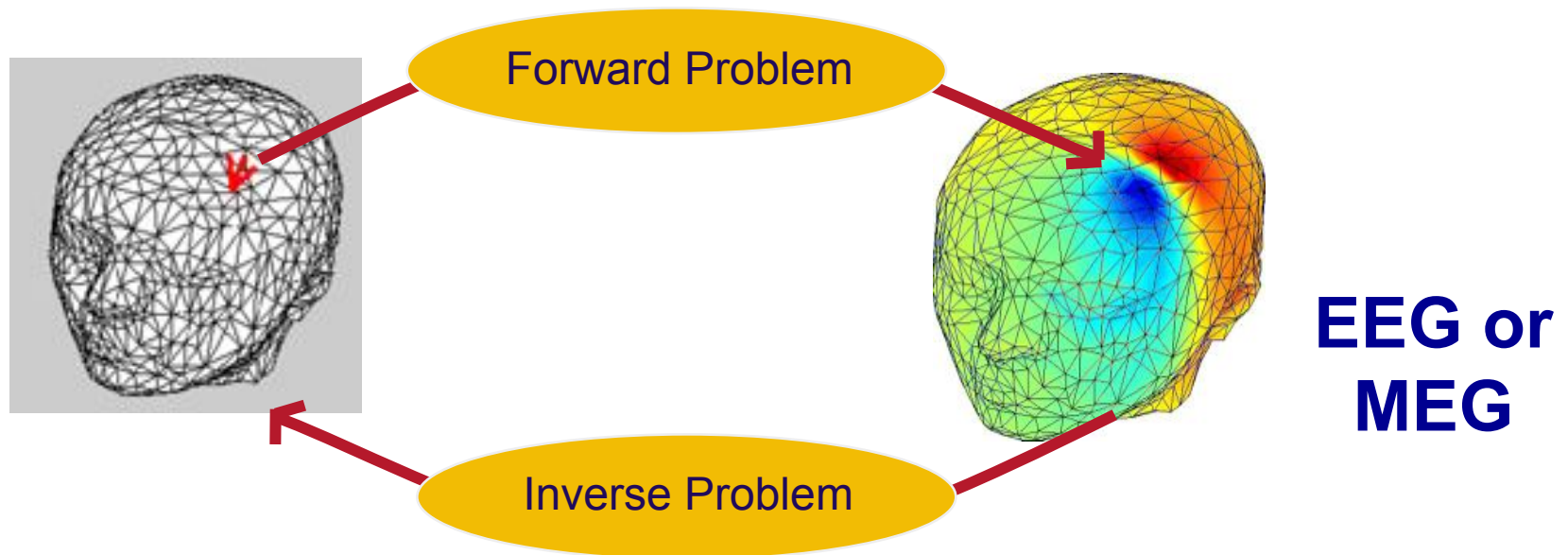
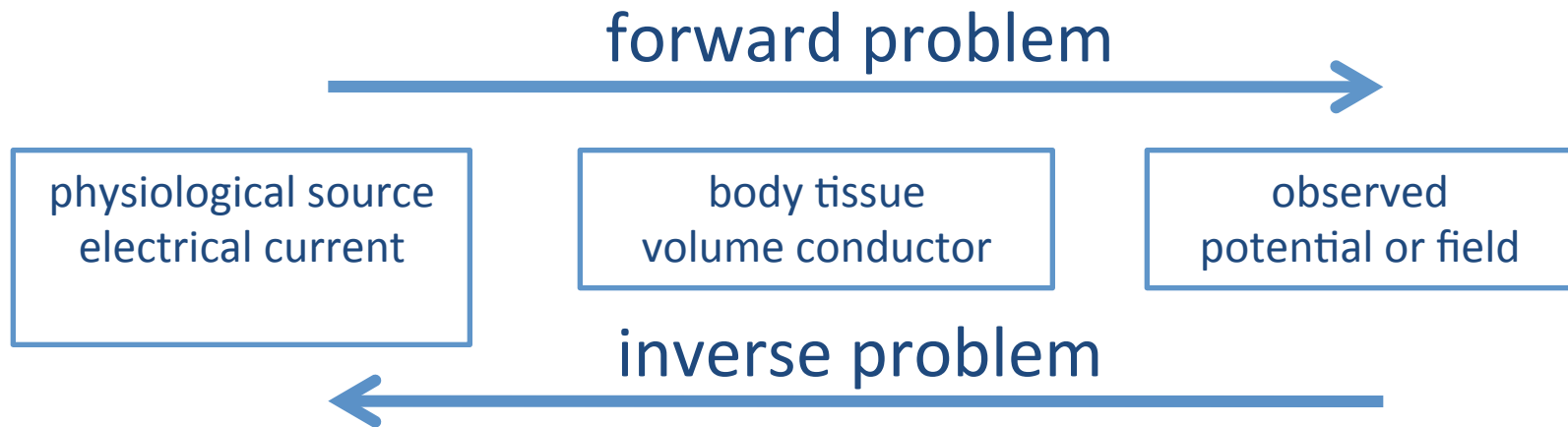
- MR head image: ~non-invasive, confining, expensive
- Electrode position measurement: Slow, expensive

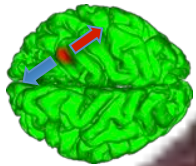
Alternatives:

- Template head image: customized (age, race, gender,...)
- Electrode photogrammetry: simple, cheap or free

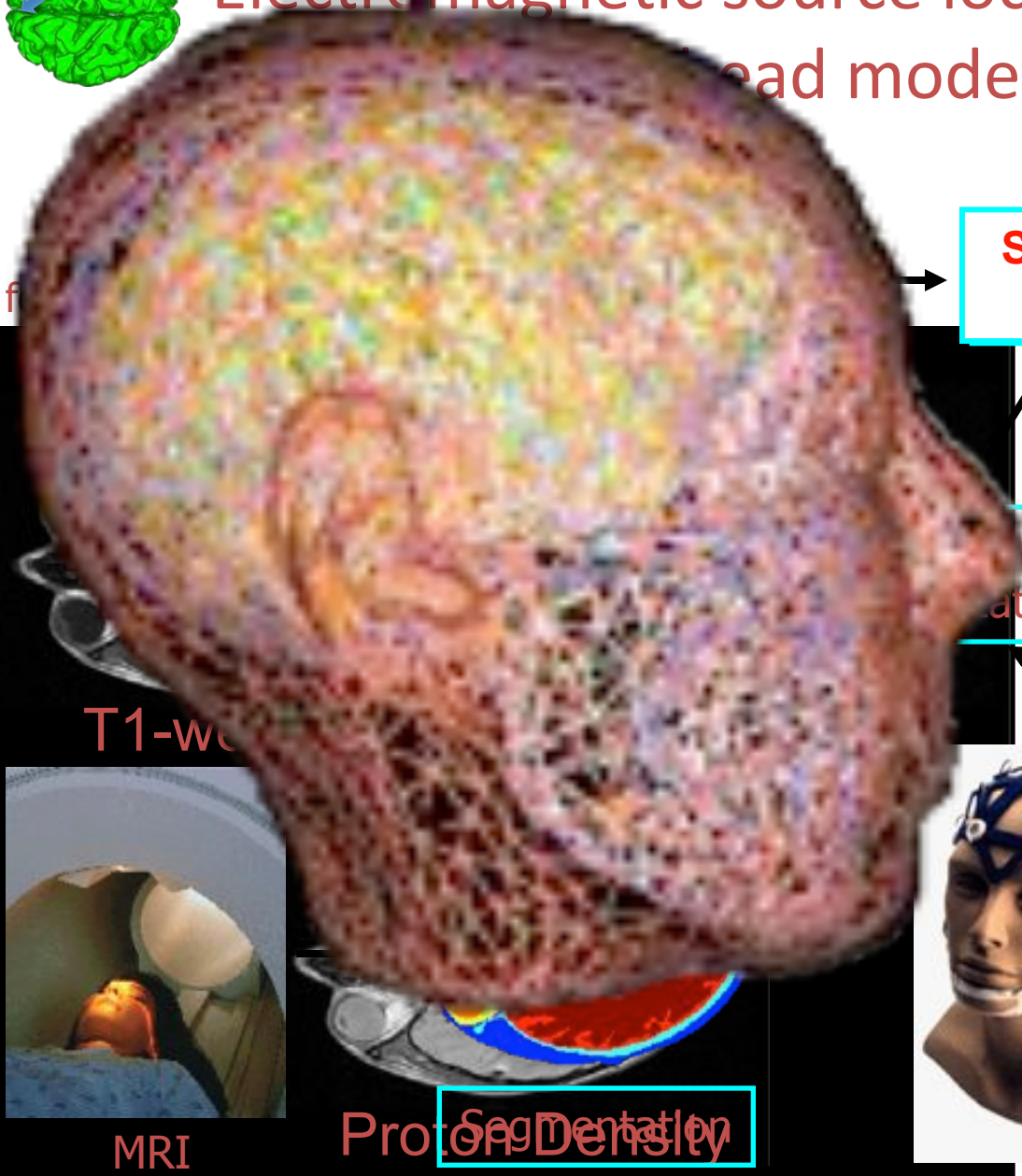


Source modeling



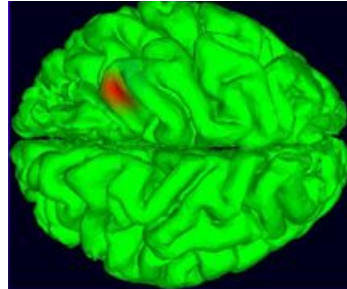


Electromagnetic source localization using realistic head models (NFT)



Simple Map

SCS



Source Image

Signal Processing

Localization



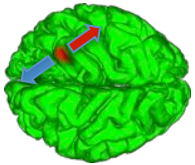
T1-weighted

MRI

Proton Density



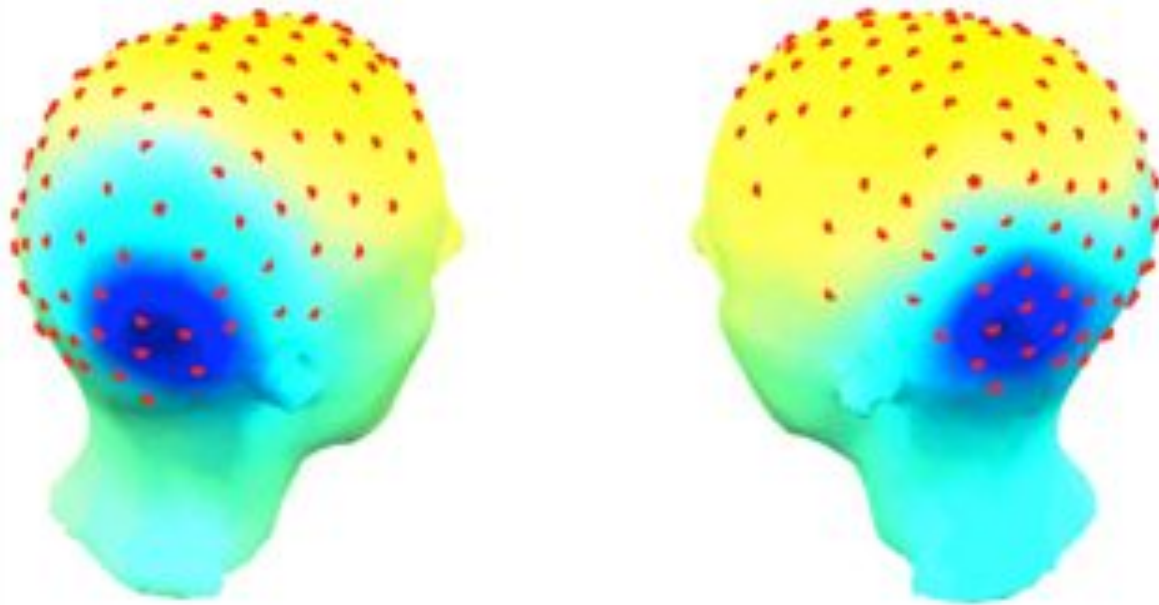
EEG/MEG



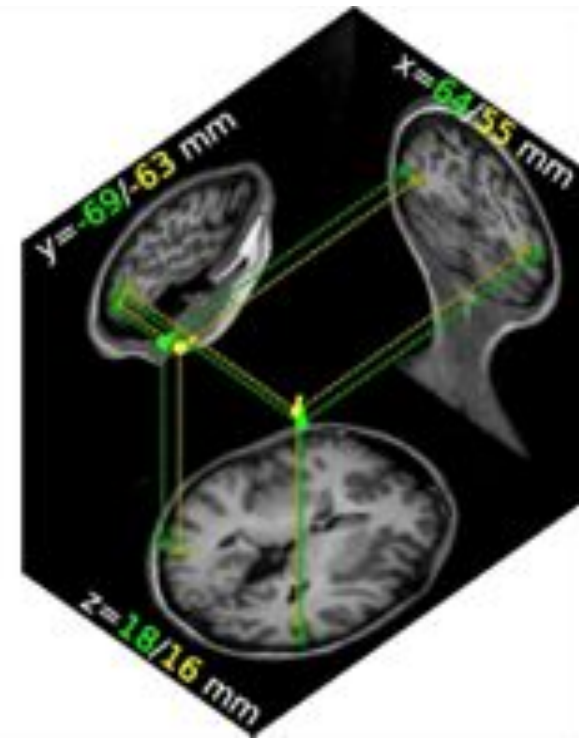
Source Localization Requirements

- ◆ Selected/processed EEG signal
 - **Simple single-source scalp map !**
- ◆ Number/positions of electrodes on the head surface
- ◆ Numerical head model
- ◆ Co-registration of EEG electrodes with head model
- ◆ Evidence/assumptions about the source space
- ◆ Choice of inverse model
- ◆ Choice of numerical method

3- and 4-layer MR-based realistic head model



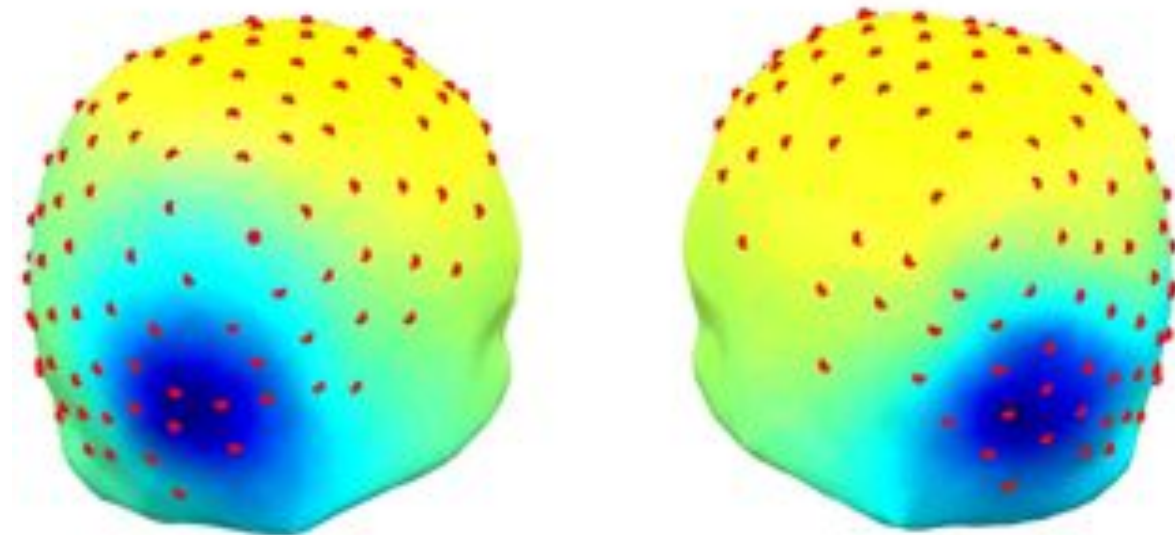
Scalp maps of 2 components



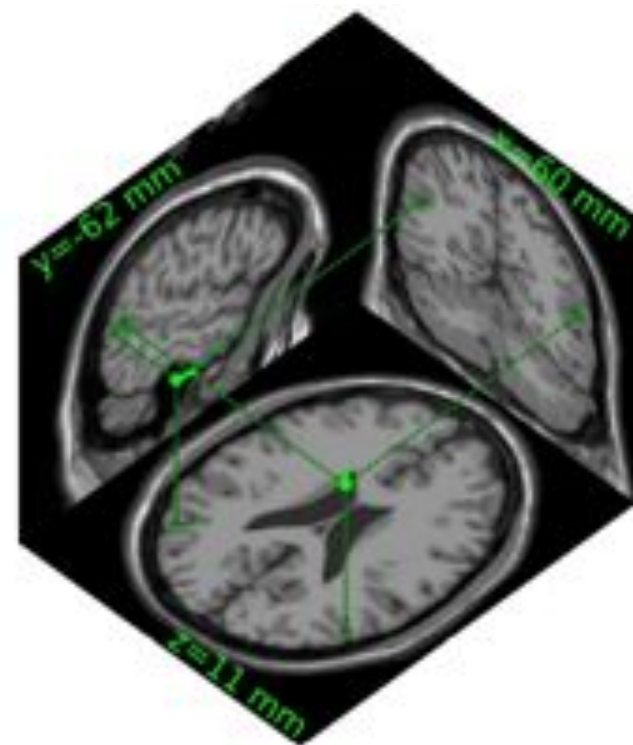
Sources of 2 components

green dipoles - 4-layer
yellow dipoles - 3-layer

MNI template head model

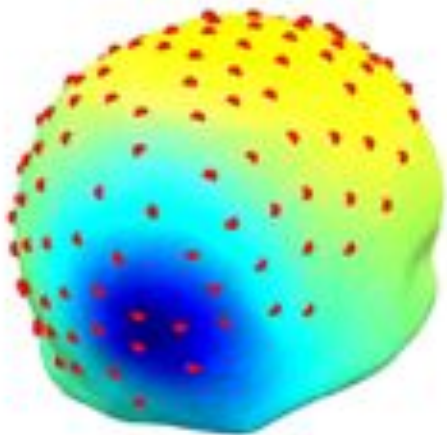


Scalp maps of 2 components

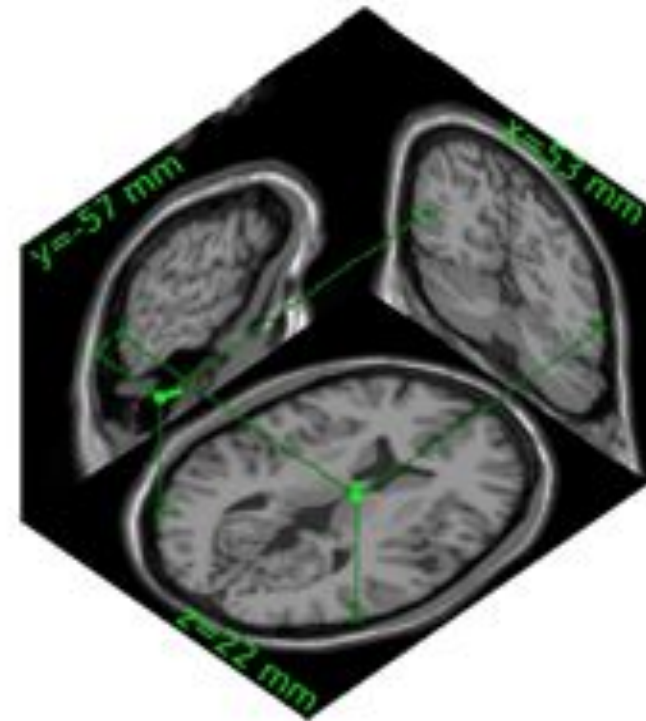
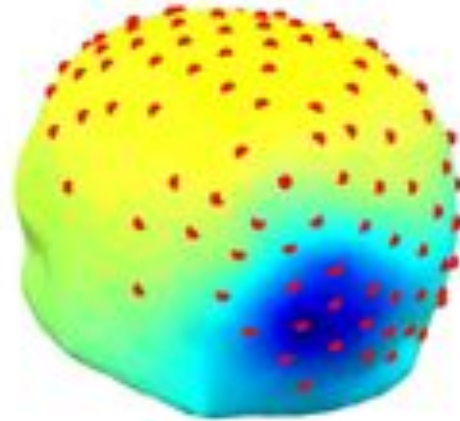


Sources of 2 components

Electrode-position warped MNI template head model

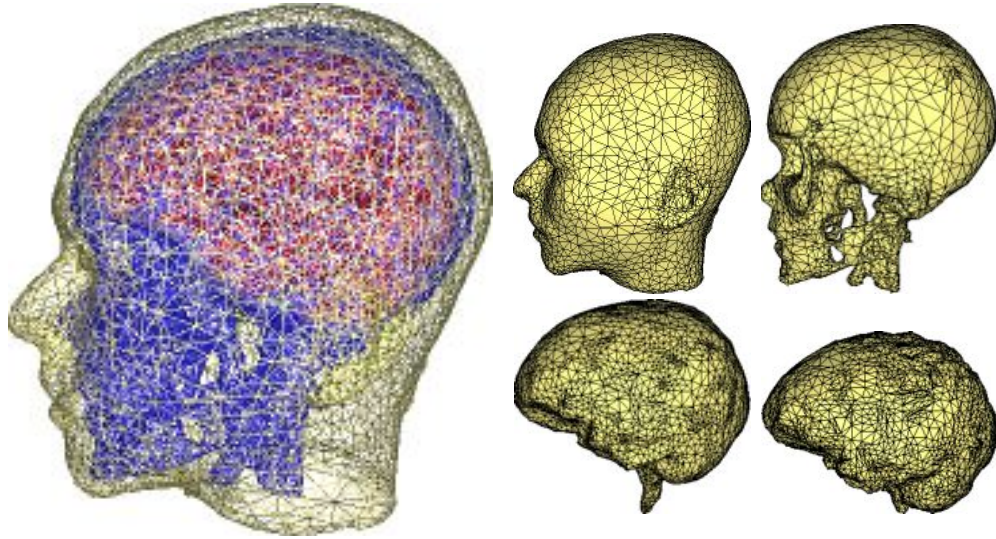


Scalp maps of 2 components

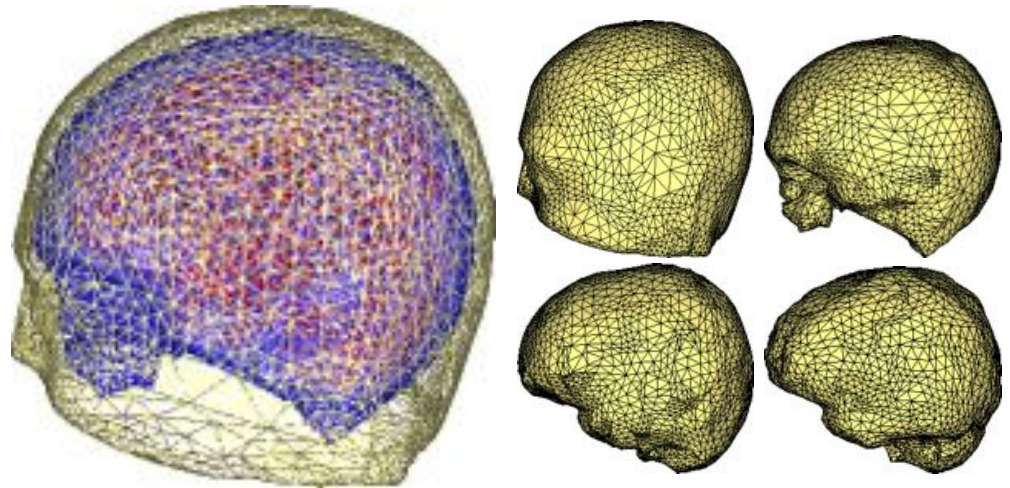


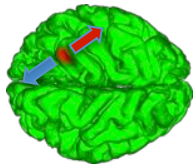
Sources of 2 components

Four-layer individual BEM head model



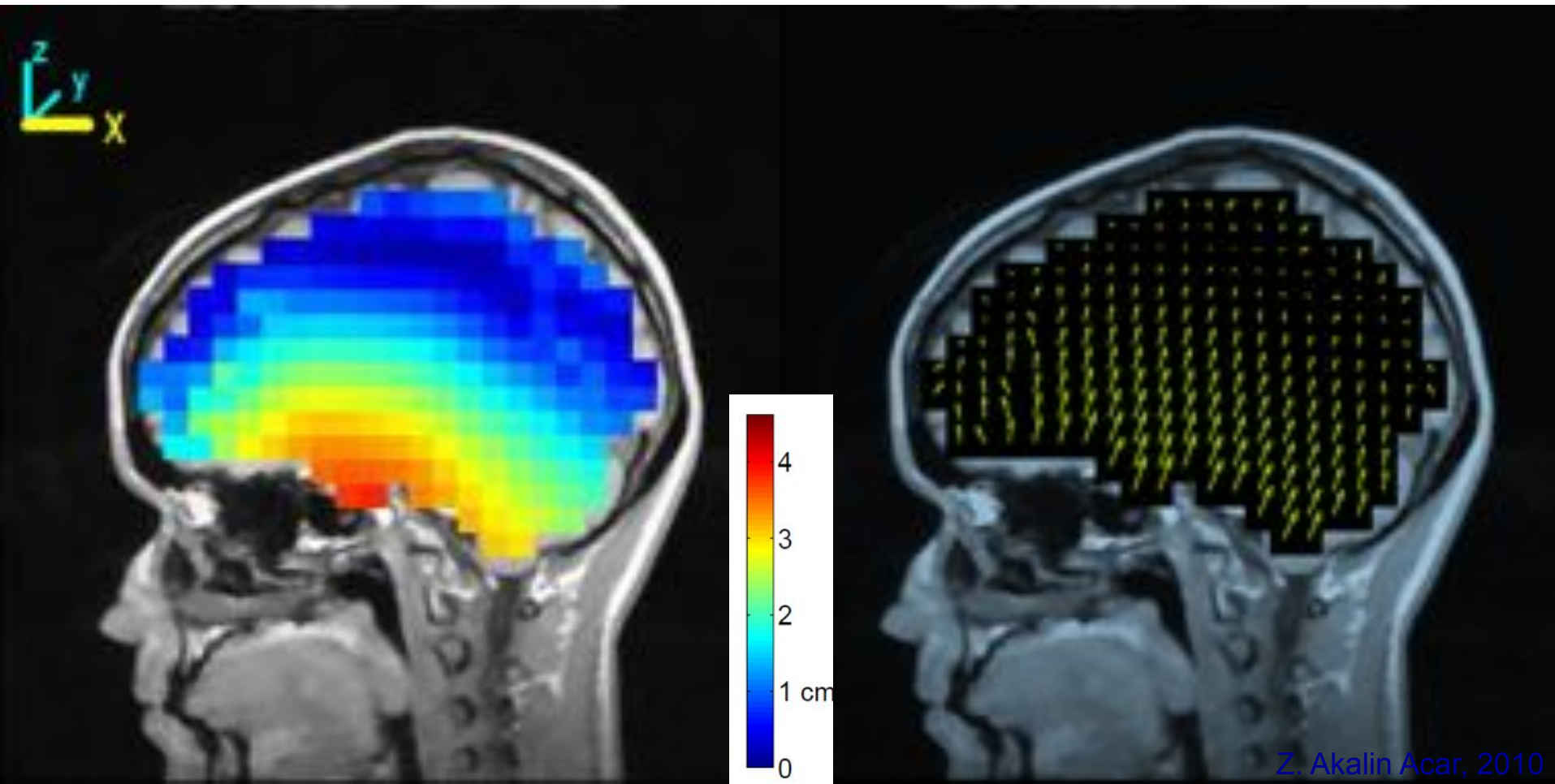
Four-layer MNI template BEM head model





Source Localization Error

- Using a simple **3-layer spherical** head model
- Instead of a good 4-layer **individual BEM** head model...



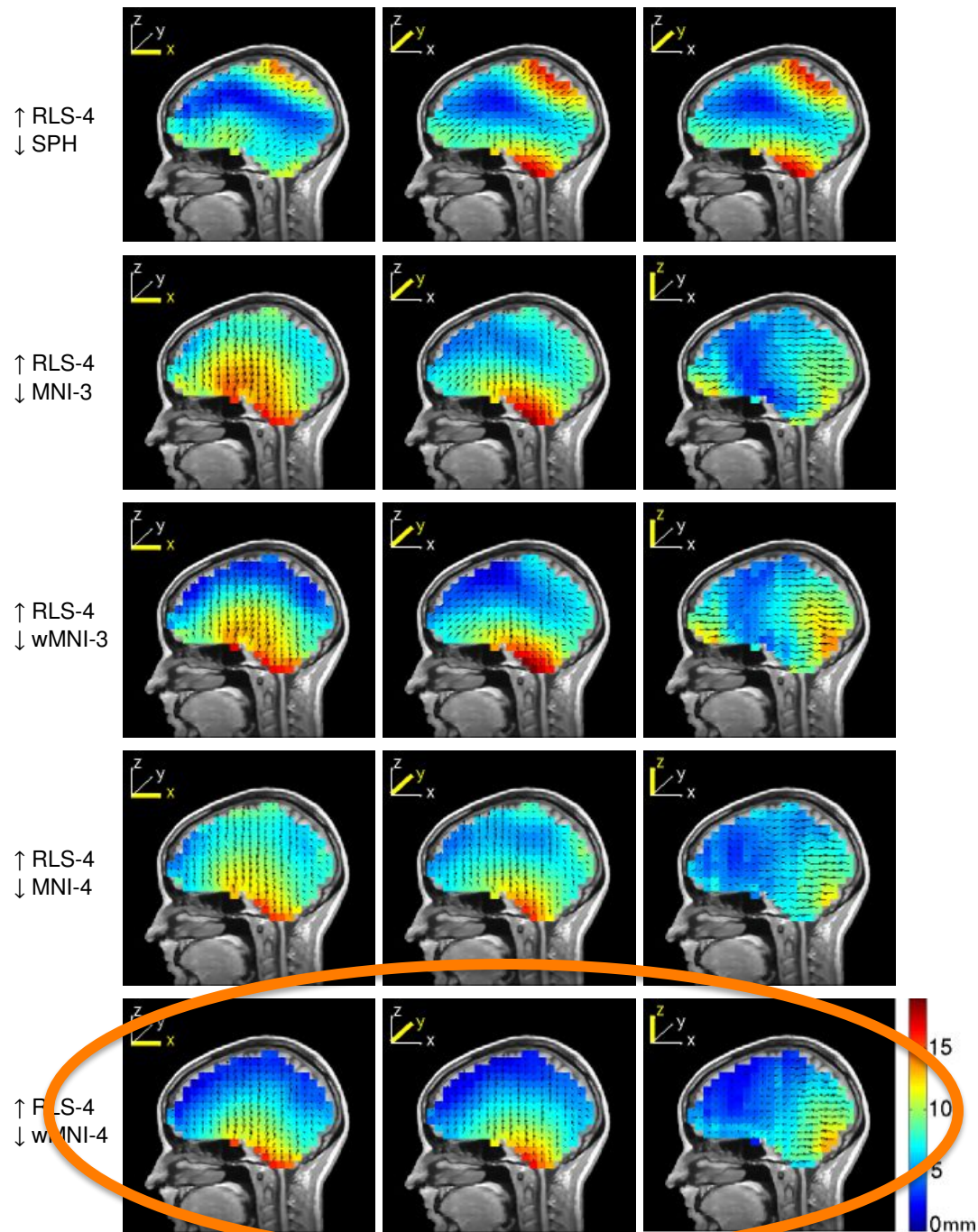


Fig. 9
Mean of 4 Ss

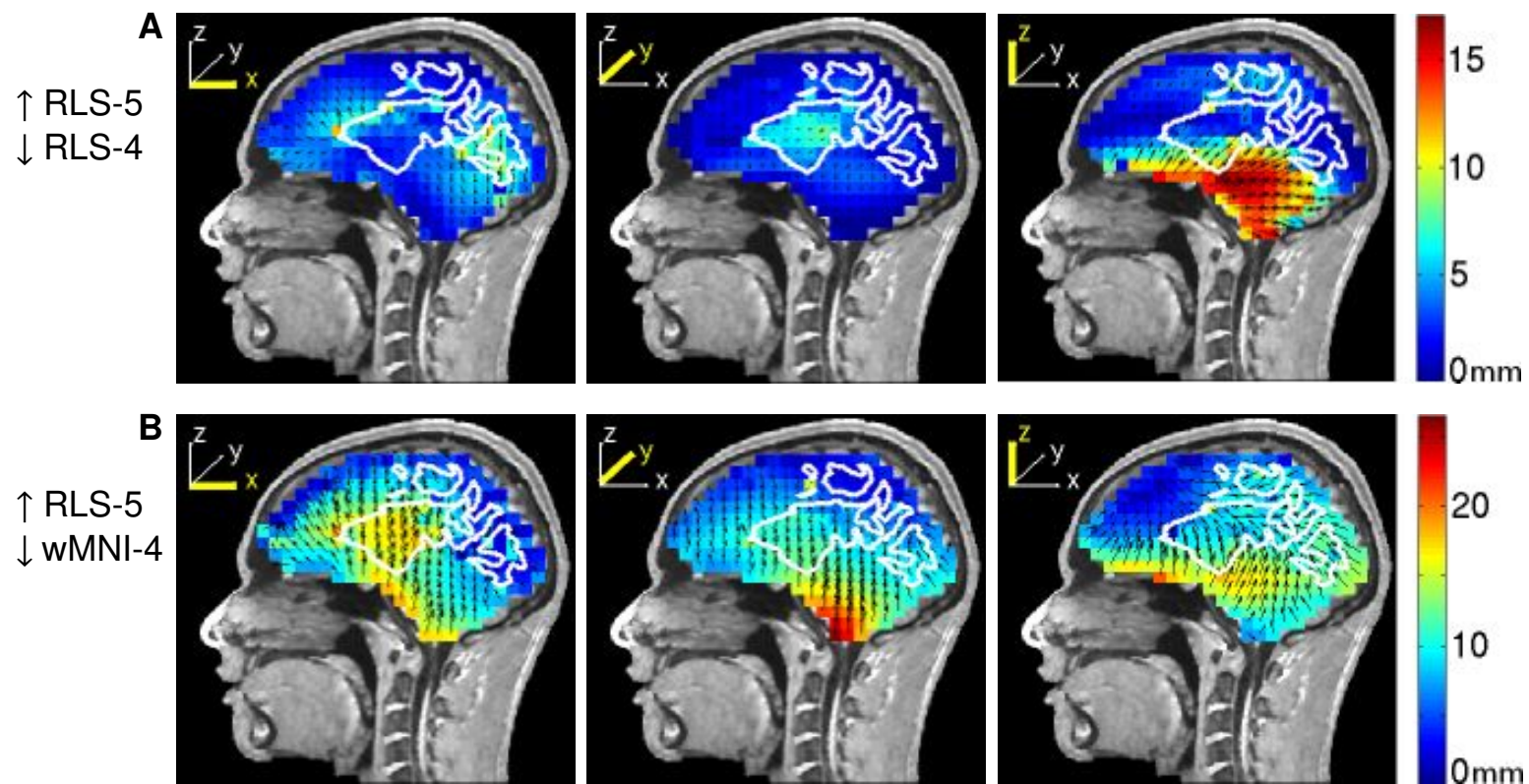


Fig. 11
5 \rightarrow 4-layer

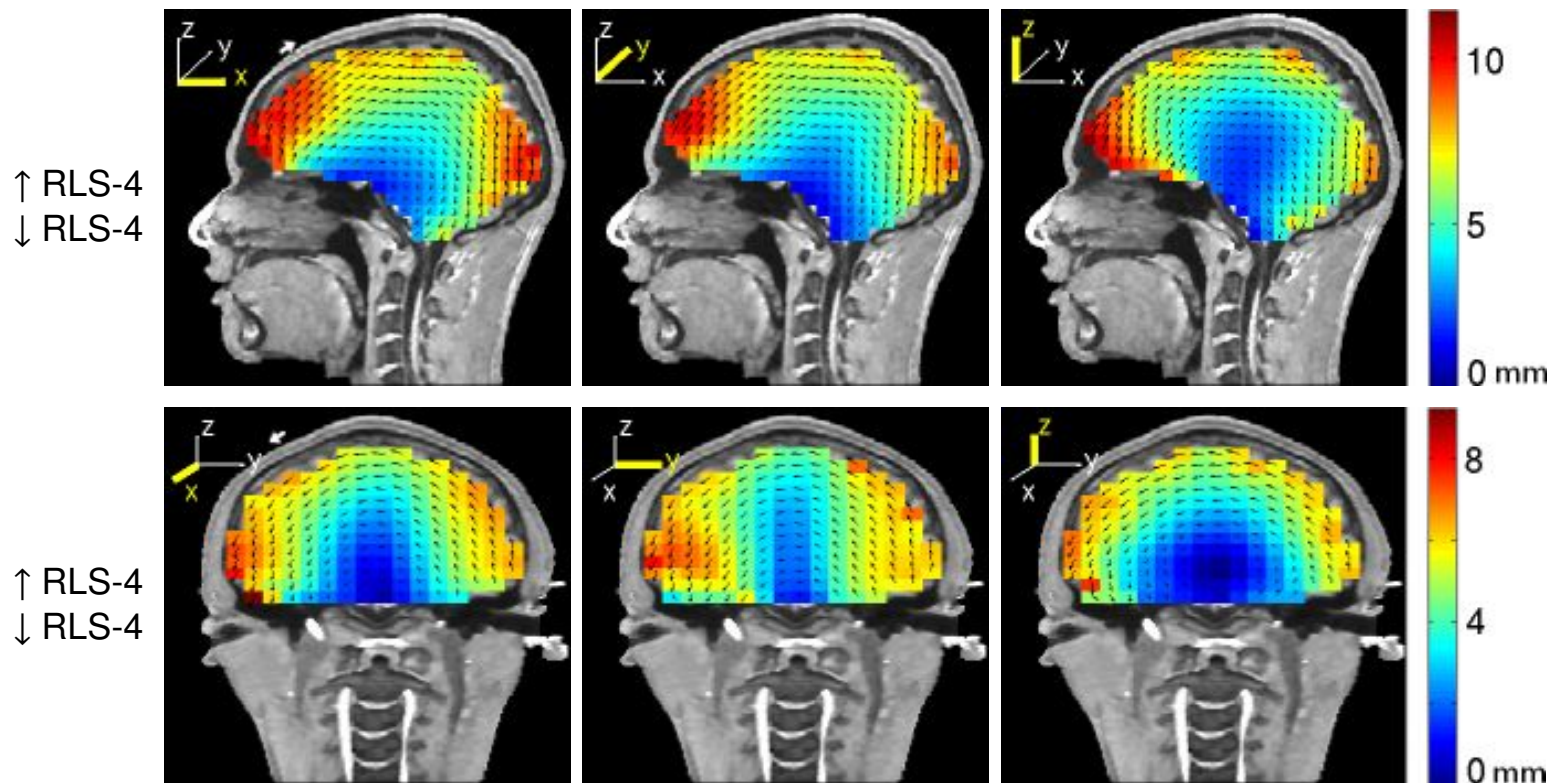
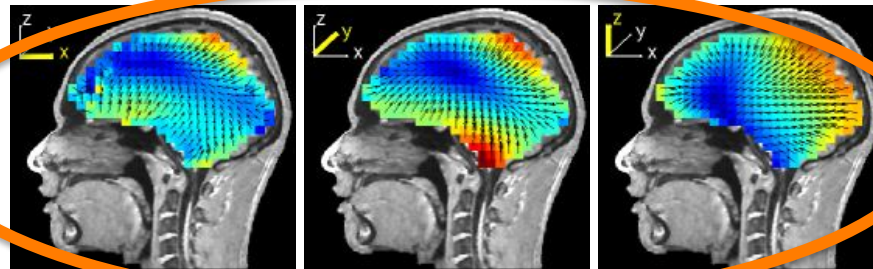
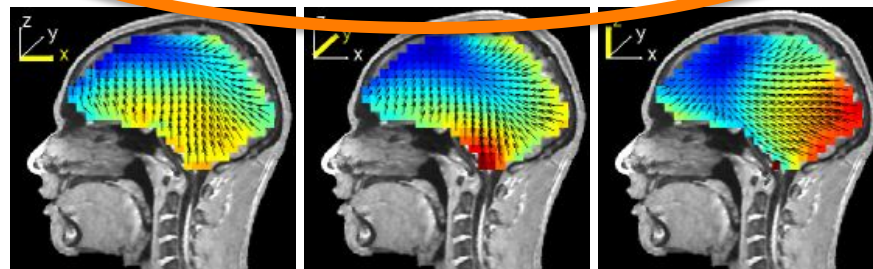


Fig. 12
Cap shifts

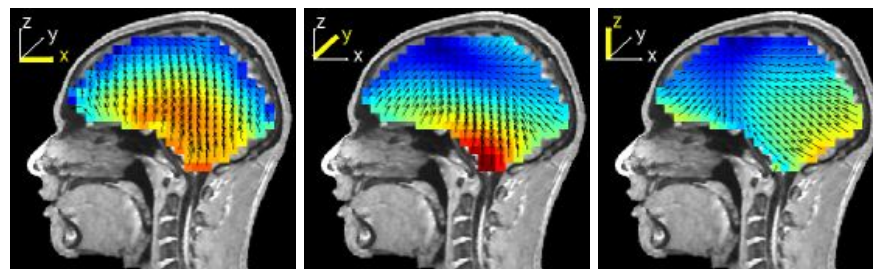
↑ RLS-4
↓ SPH



↑ RLS-4
↓ MNI-3



↑ RLS-4
↓ wMNI-3



↑ RLS-4
↓ MNI-4



↑ RLS-4
↓ wMNI-4

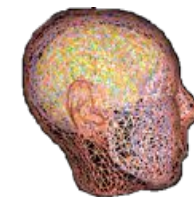
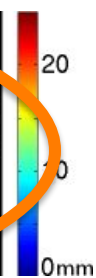
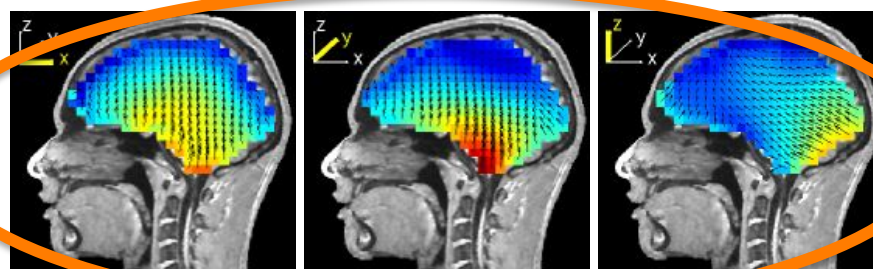


Fig. 4
Subject S1

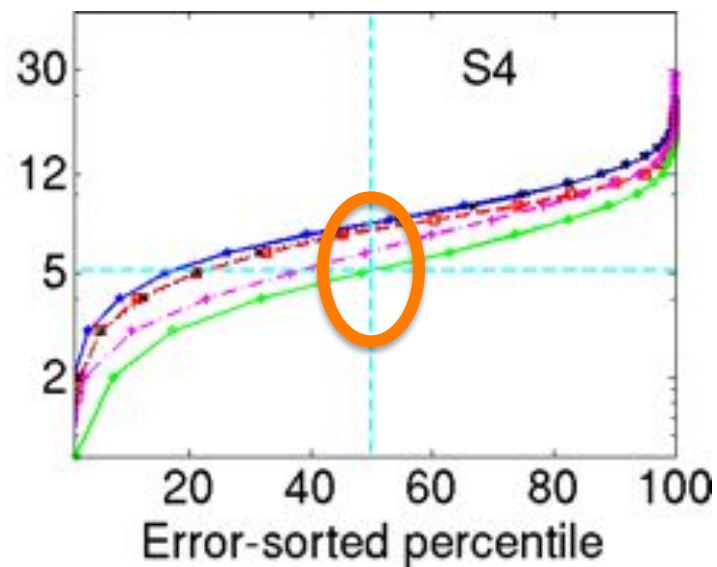
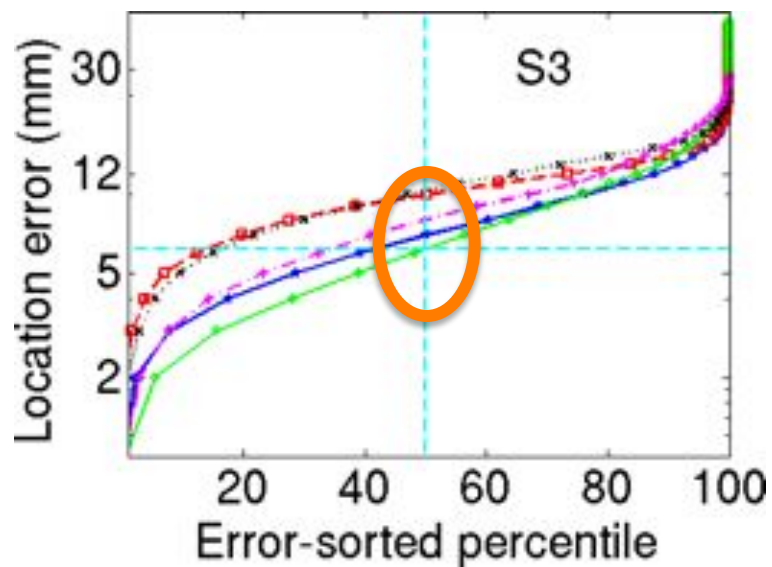
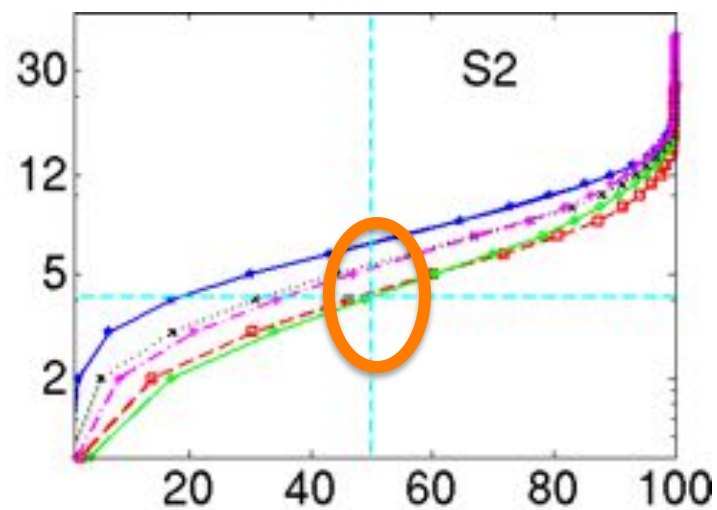
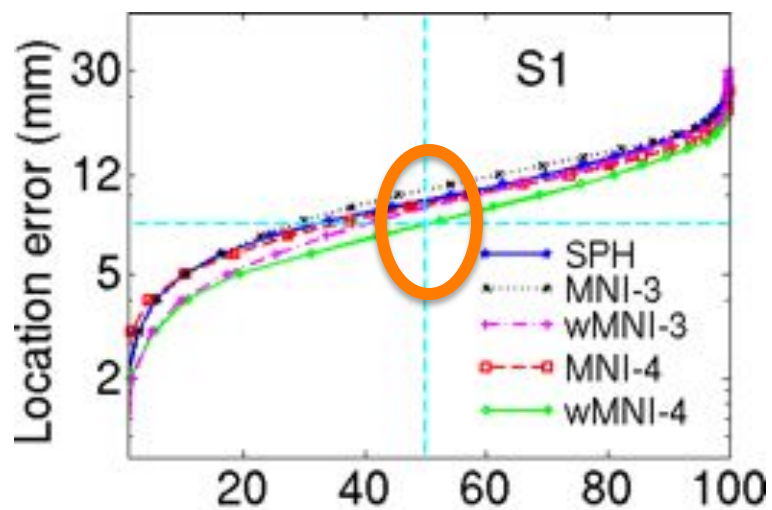
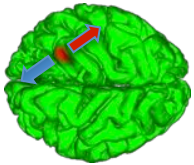
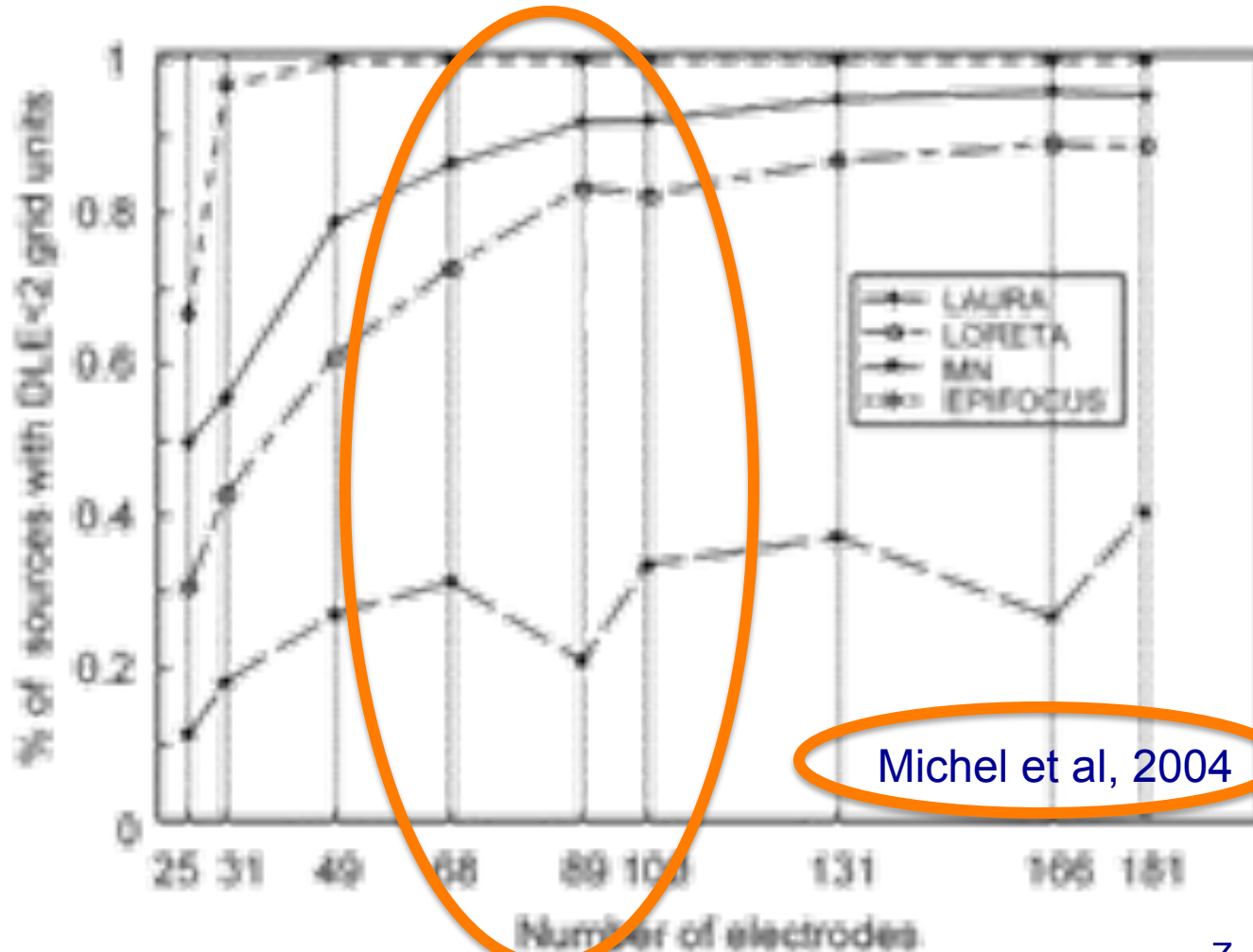


Fig. 7



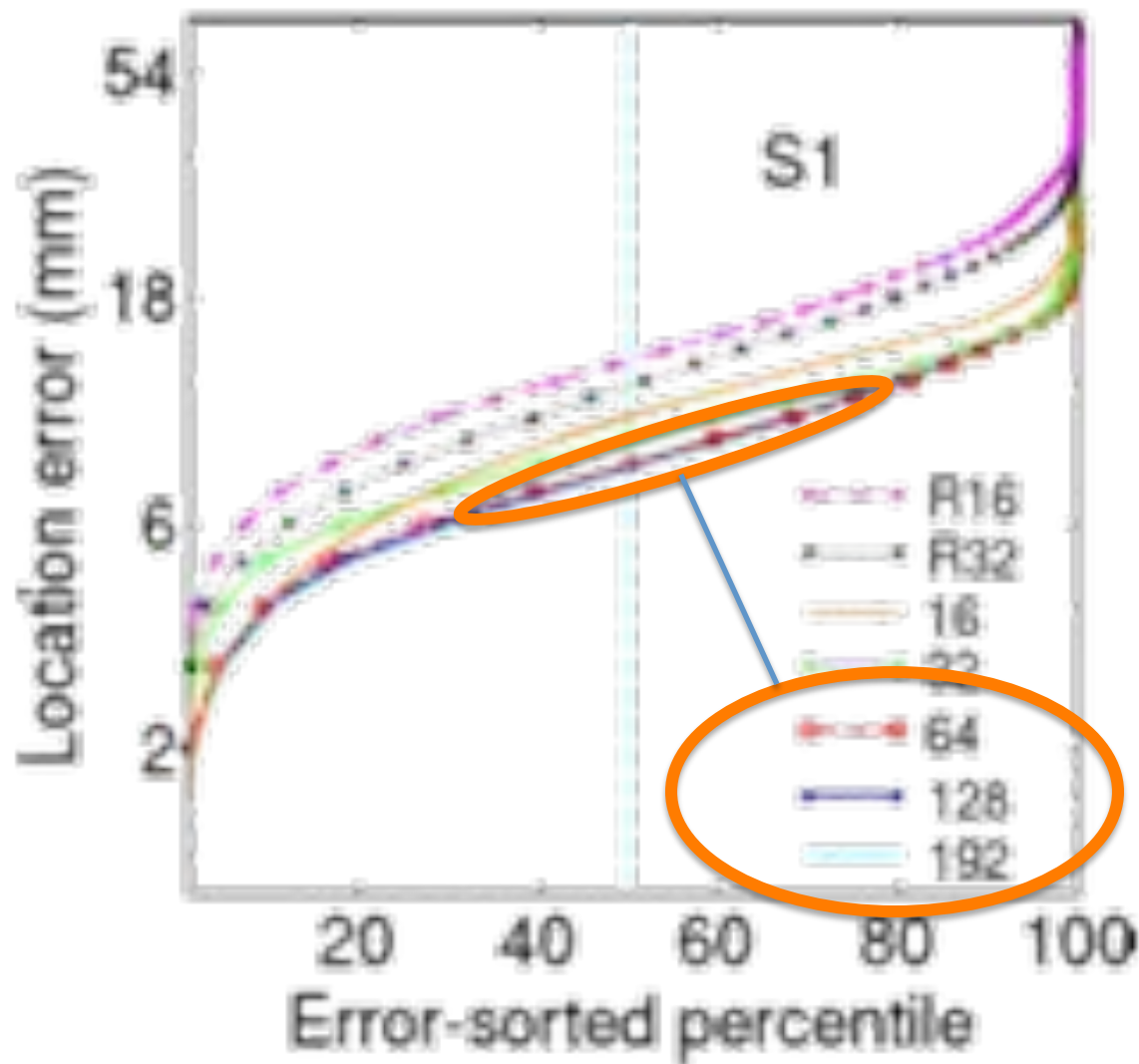
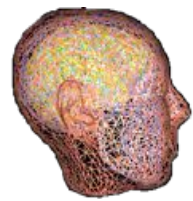
Effect of Number of Electrodes

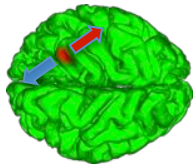
- Single dipole source
- 3-layer spherical head model
- 1152 solution points



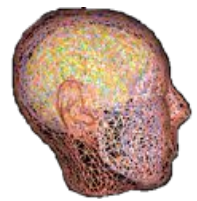
Michel et al, 2004

Effect of Number of Electrodes

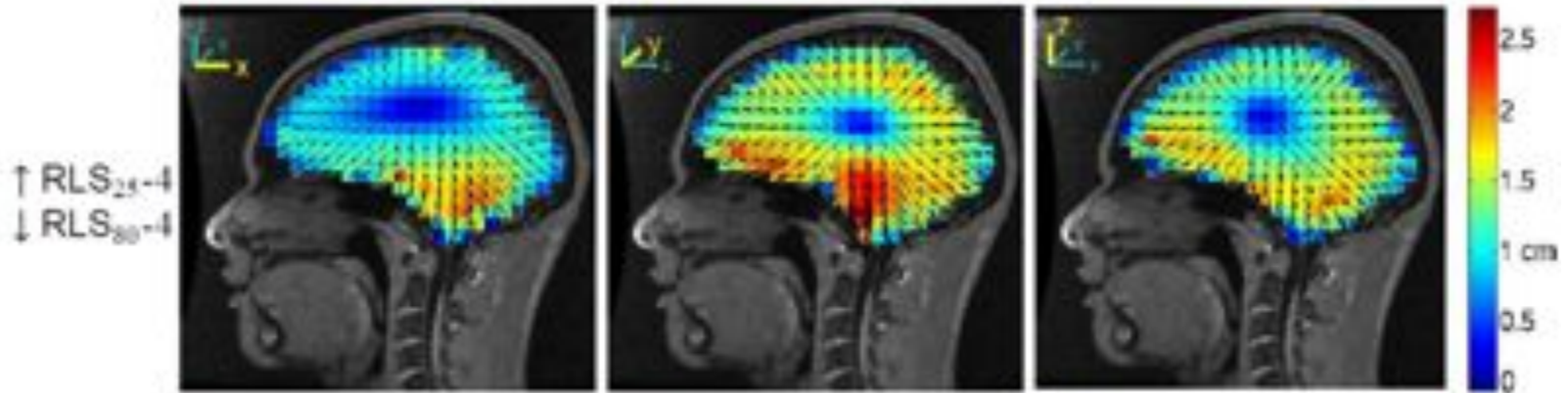




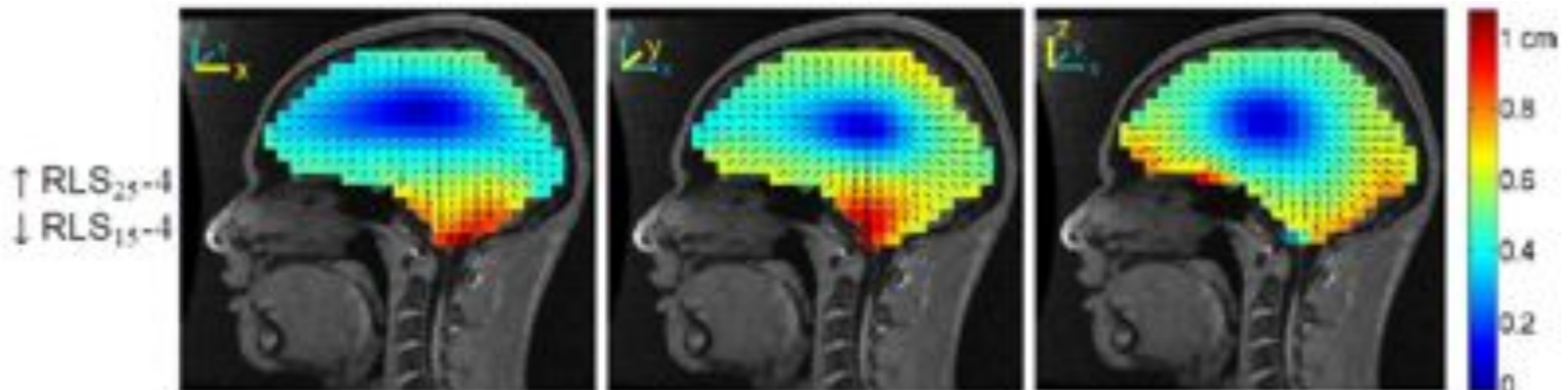
Source Localization Errors

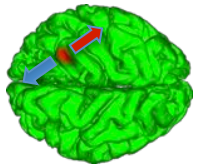


- Forward simulation – BSCR 25
- Inverse model – BSCR 80

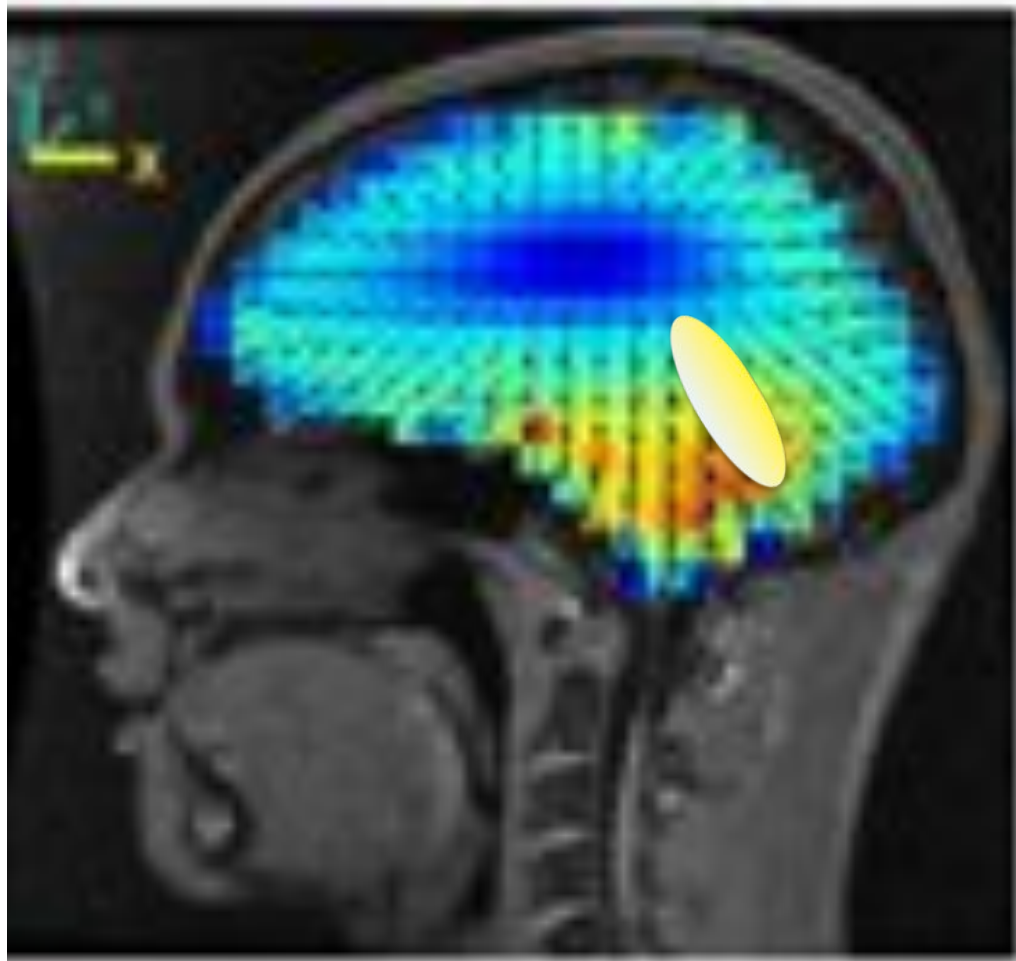
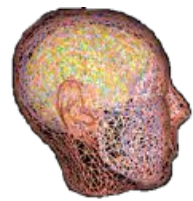


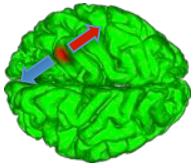
- Forward simulation – BSCR 25
- Inverse model – BSCR 15





Source Localization Errors





Effect of reference electrode

“The choice of a particular reference electrode ... does not change in any way the biophysical information contained in the potential distribution. It does not in any way change the relation between source and potential, except for an additive constant of no physical significance.”

- Geselowitz, 1998

NFT Download

sccn.ucsd.edu/nft



NFT Reference Paper (2010)

Contents lists available at ScienceDirect

Journal of Neuroscience Methods

journal homepage: www.elsevier.com/locate/jneumeth

Neuroelectromagnetic Forward Head Modeling Toolbox[☆]

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ARTICLE INFO

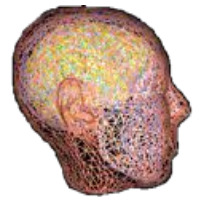
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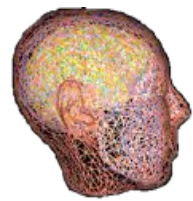
ABSTRACT

This paper introduces a Neuroelectromagnetic Forward Head Modeling Toolbox (NFT) running under MATLAB (The Mathworks, Inc.) for generating realistic head models from available data (MRI and/or electrode locations) and for computing numerical solutions for the forward problem of electromagnetic source imaging. The NFT includes tools for segmenting scalp, skull, cerebrospinal fluid (CSF) and brain tissues from T1-weighted magnetic resonance (MR) images. The Boundary Element Method (BEM) is used for the numerical solution of the forward problem. After extracting segmented tissue volumes, surface

NFT: Introduction

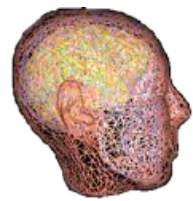


- ◆ ***A MATLAB toolbox for realistic head modeling and forward problem solving.***
- ◆ **Can use available subject information:**
 - T1-weighted 3-D MR images *and/or*
 - Digitized sensor (electrode) locations
- ◆ **Implements all head modeling steps:**
 - Segmentation of MR images
 - Mesh generation
 - Warping a template head model to the sensor positions
 - Sensor/head image co-registration
 - Lead field matrix: Source space → Sensors



Forward Problem Solver

- ◆ MATLAB interface to numerical solvers
- ◆ Boundary Element Method
 - No MEG (yet)
 - Supports IPA and Accelerated BEM
 - Interfaces to the Matrix generator written in C++
- ◆ Other computations in MATLAB
- ◆ Generated matrices are stored on disk for future use.
- ◆ Other solvers:
 - Finite Element Method (FEM)



NFT: Operation

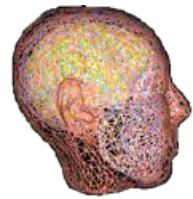
◆ T1 MR Images

- Choose subject
- Generate subject head model
- Segmentation
 - Mesh generation
- Register sensors to mesh
 - Sensor set = session
- Generate forward model
- Generate Lead Field Matrix

◆ Template Mesh

- Choose subject
- Select sensors
- Warp Template to sensors
- Generate forward model
- Generate LFM for sensors

NFT Main Menu



Neuroelectromagnetic_Forward_Modeling_Toolbox

Subject Folder

Subject Name

Session Name

Head Modeling

From a magnetic Resonance Image

Image Segmentation

Mesh Generation

Source Space Generation

Electrode Co-Registration

From electrode Position Data

Template Warping

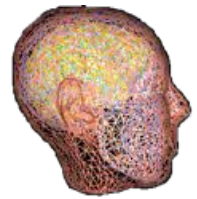
Forward Model Generation

Subject Selection

Head Modeling

Forward Modeling

Subject Selection



Subject Folder

Subject Name

Session Name

Neuroelectromagnetic_Foreward_Modeling_Toolbox

Subject Folder

Subject Name

Session Name

Head Modeling

From a magnetic Resonance Image

Image Segmentation

Mesh Generation

Source Space Generation

Electrode Co-Registration

From electrode Position Data

Template Warping

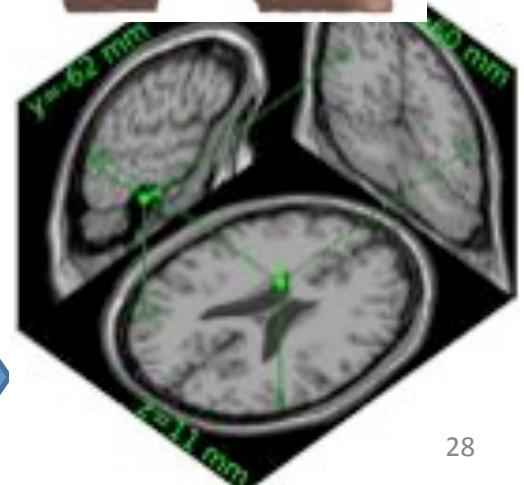
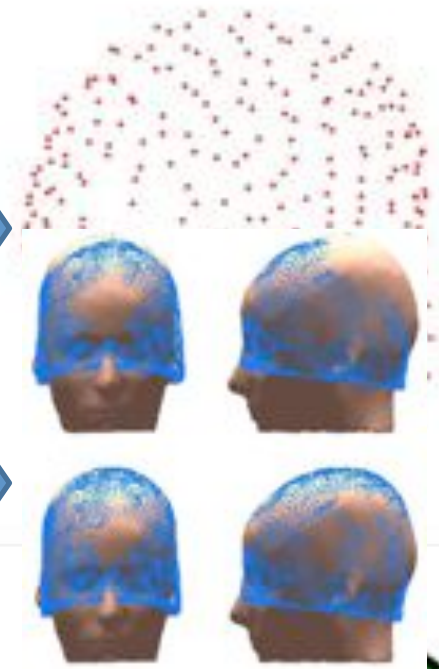
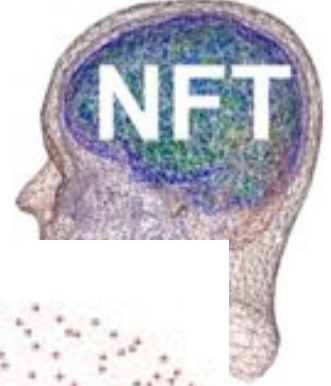
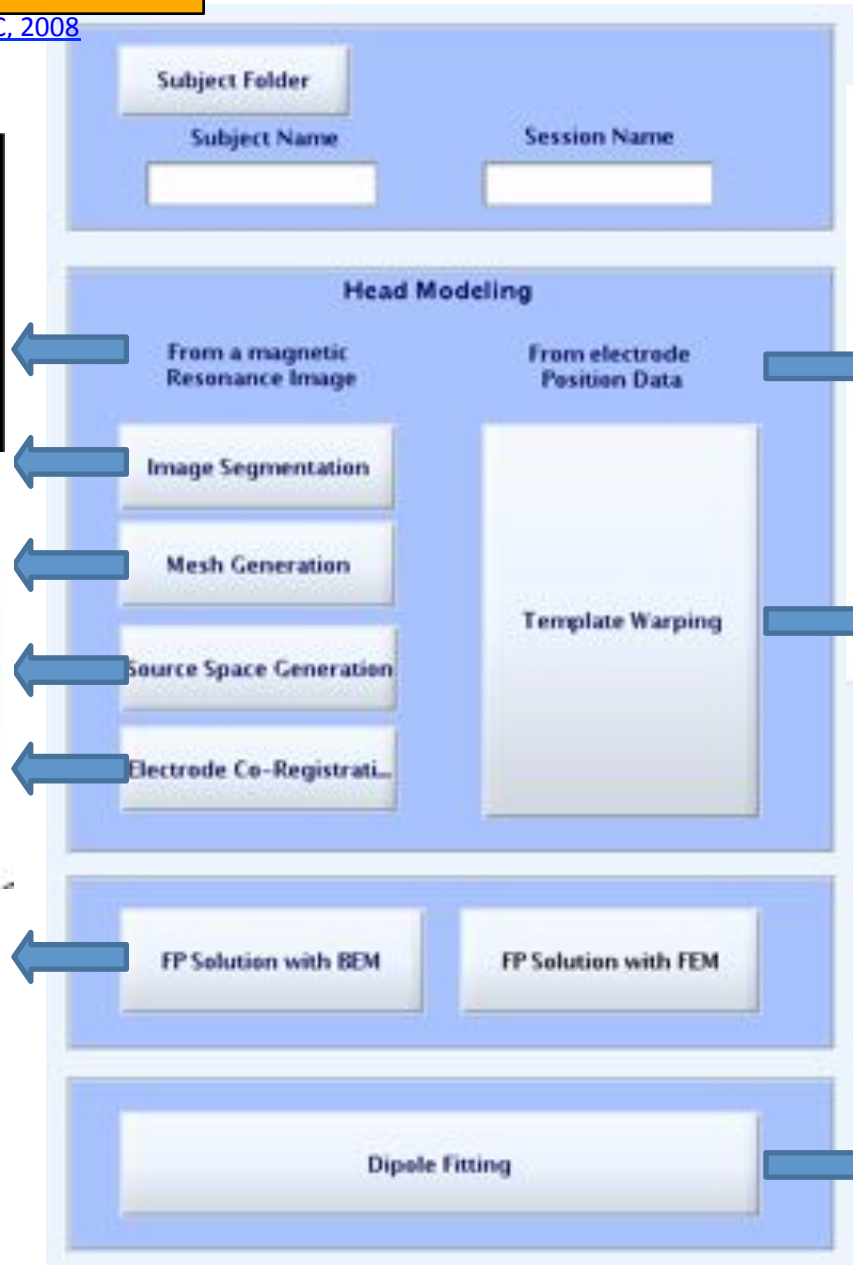
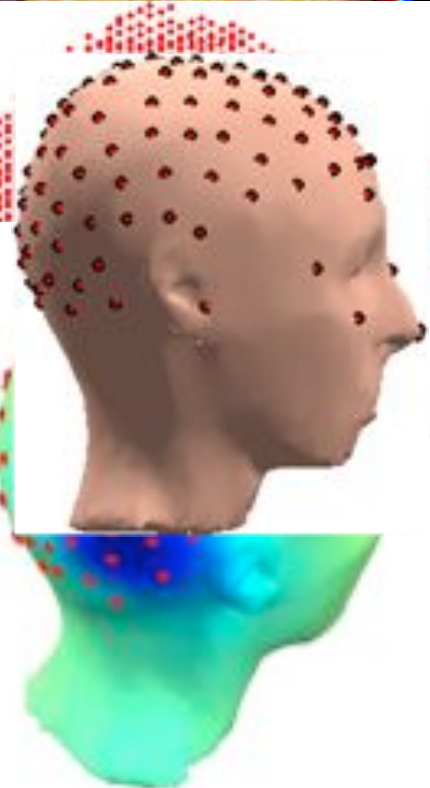
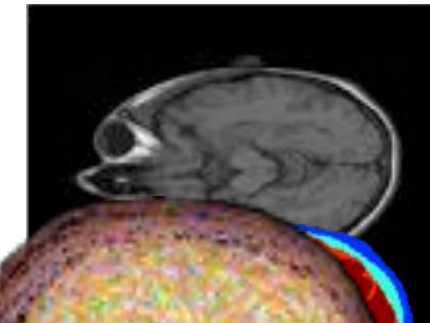
Forward Model Generation

- ▶ Select subject folder name
- ▶ Specify subject code
- ▶ Specify session name

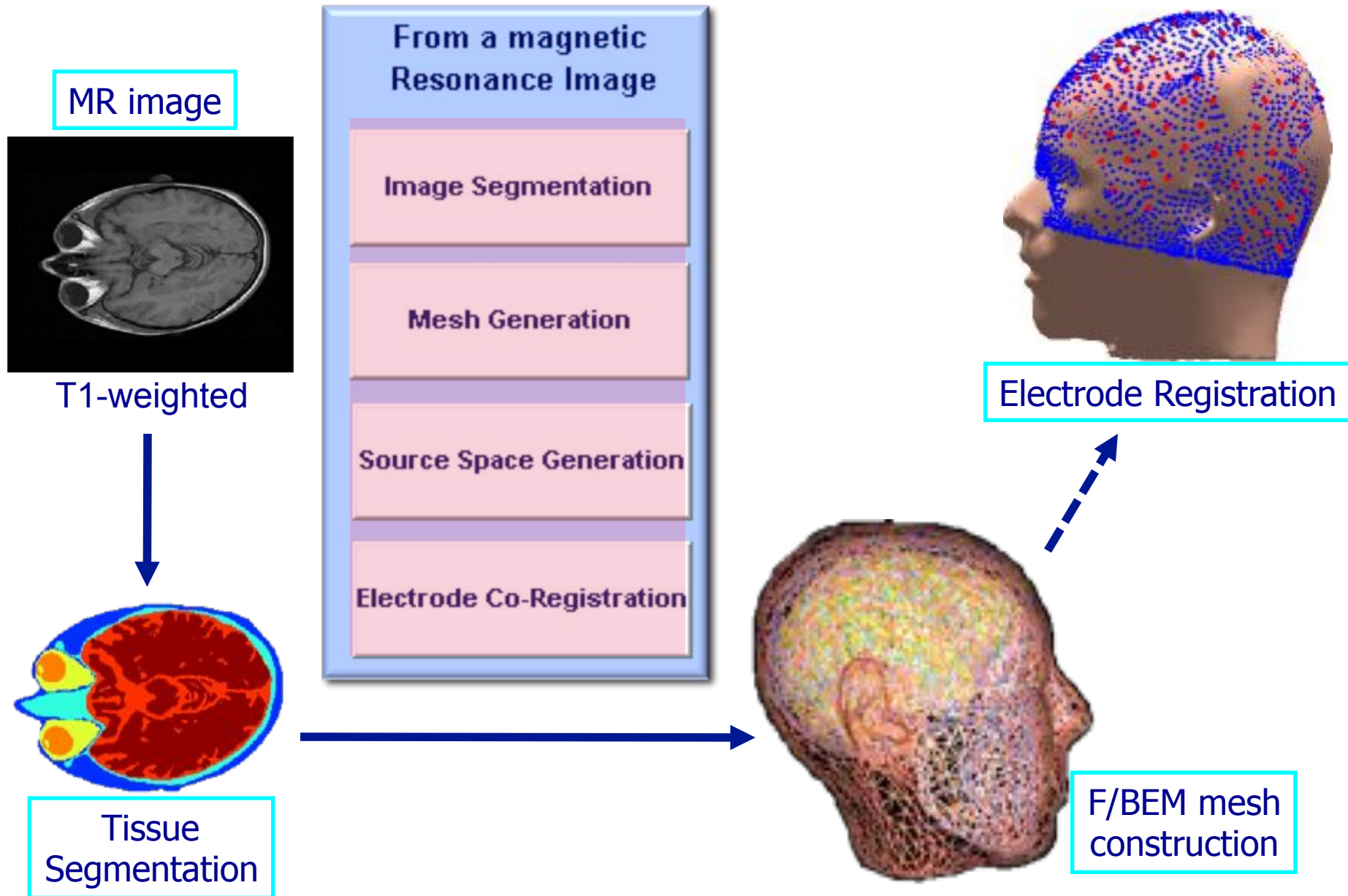
Neuroelectromagnetic Forward Head Modeling Toolbox

Akalin Acar and Makeig, J. Neurosci. Methods, 2010

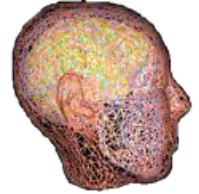
http://sccn.ucsd.edu/nft



Head modeling from an MR head image



Electrode Co-Registration



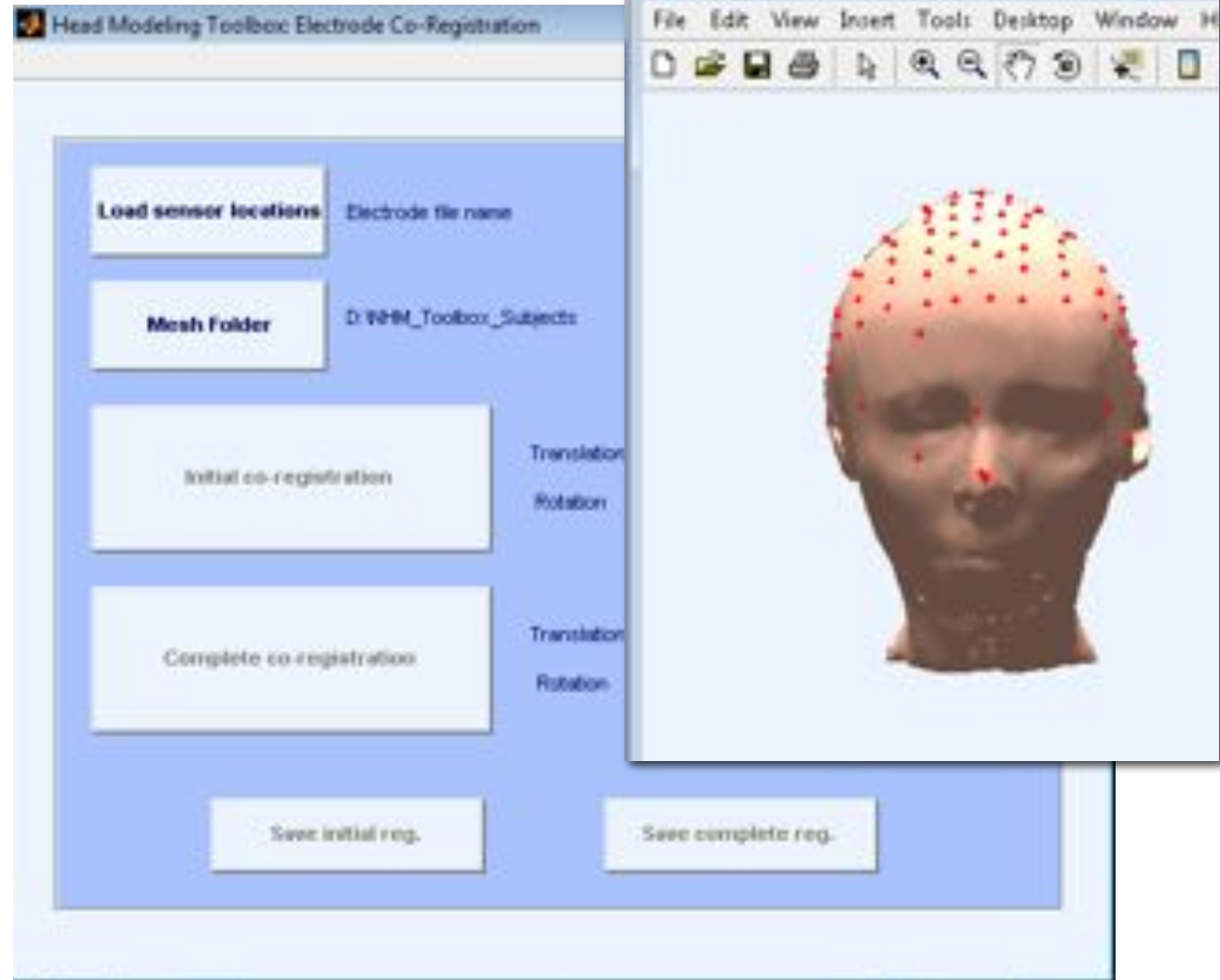
From a magnetic
Resonance Image

Image Segmentation

Mesh Generation

Source Space Generation

Electrode Co-Registration

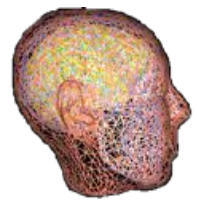


Preparing the MR image for segmentation

Use FREESURFER to

- ◆ Perform inhomogeneity correction
- ◆ Convert to 1x1x1 pixels
- ◆ Arrange direction of the image
- ◆ Save in Analyze format

Image Segmentation



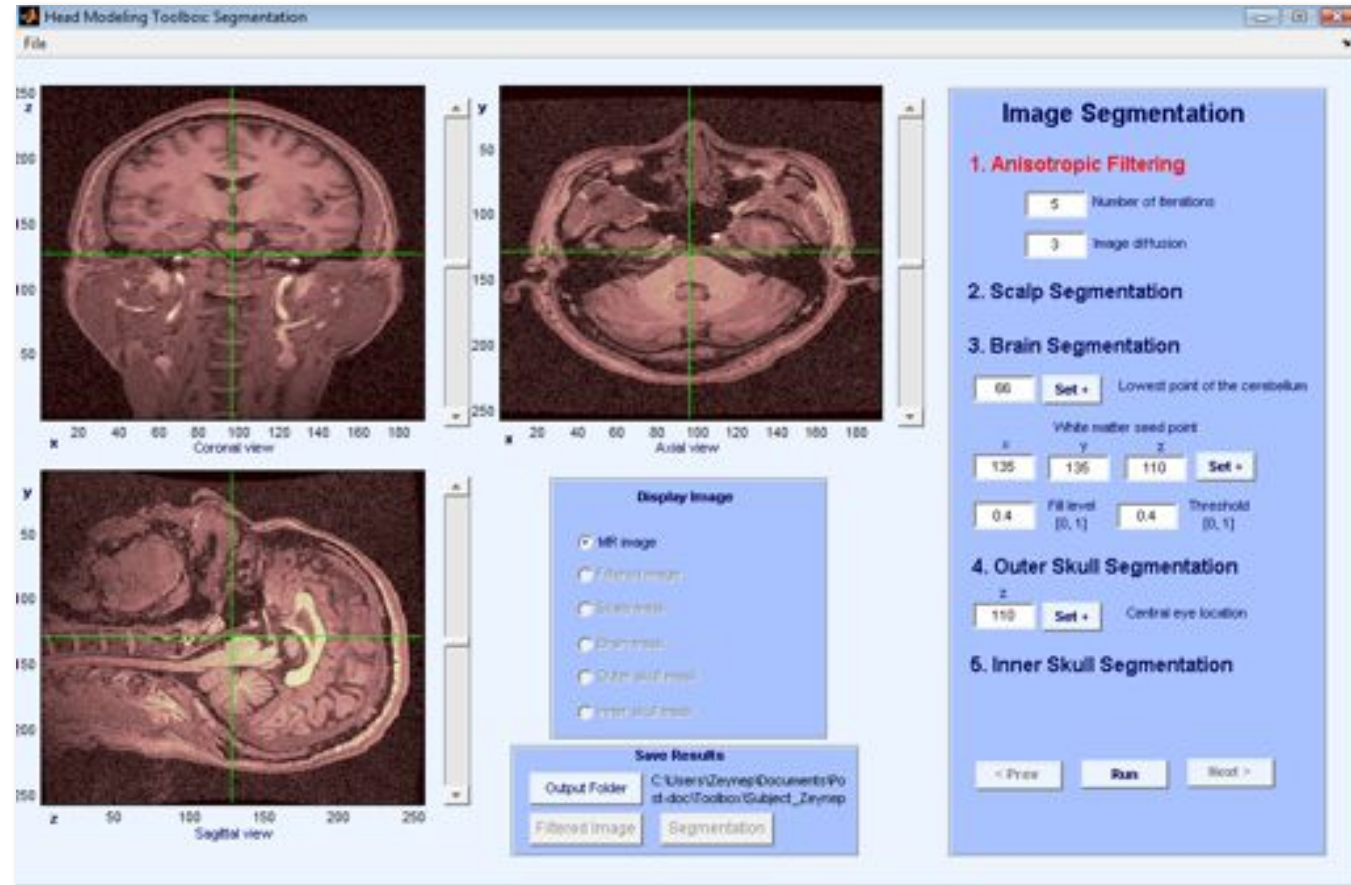
From a magnetic
Resonance Image

Image Segmentation

Mesh Generation

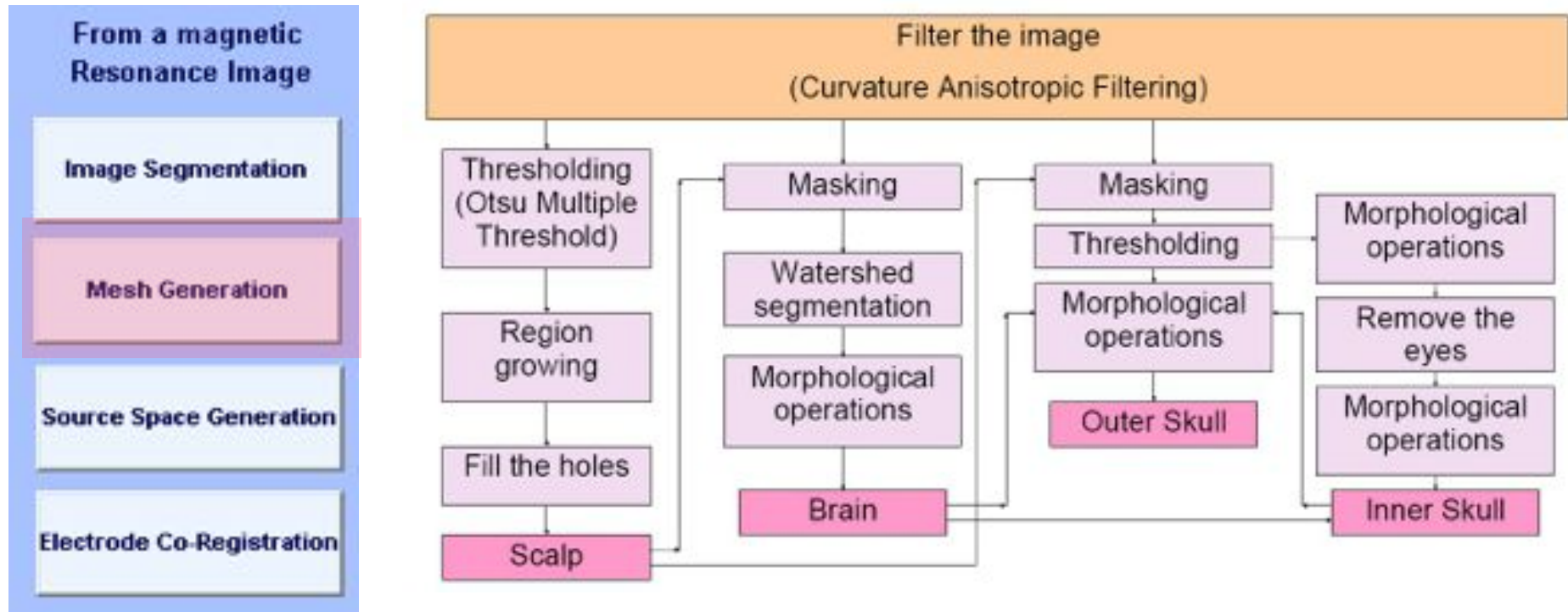
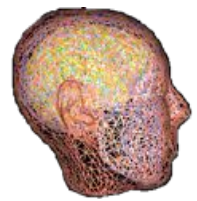
Source Space Generation

Electrode Co-Registration



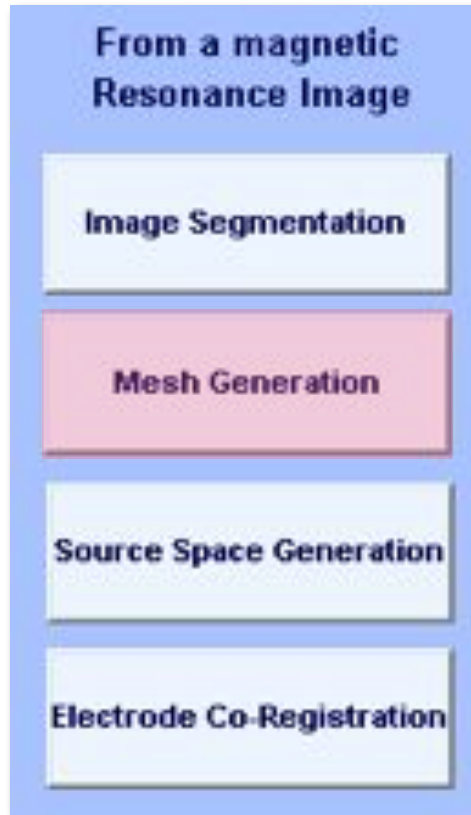
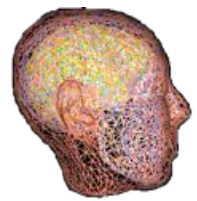
◆ Interface for Segmenting the MR image

Image Segmentation Flowchart



- ◆ Classifies four tissues from T1-weighted images
 - (Scalp, Skull, CSF and Brain)

Mesh Generation



Head Modeling Toolbox: Mesh Generation

Load Segmentation C:\Users\Zeynep\Documents\Post-doc\Toolbox\Subject_Zeynep\ze
ynep_segments

Output Folder C:\Users\Zeynep\Documents\Post-doc\Toolbox\Subject_Zeynep

4 # of layers Mesh name: zeynep

☐ Local mesh refinement

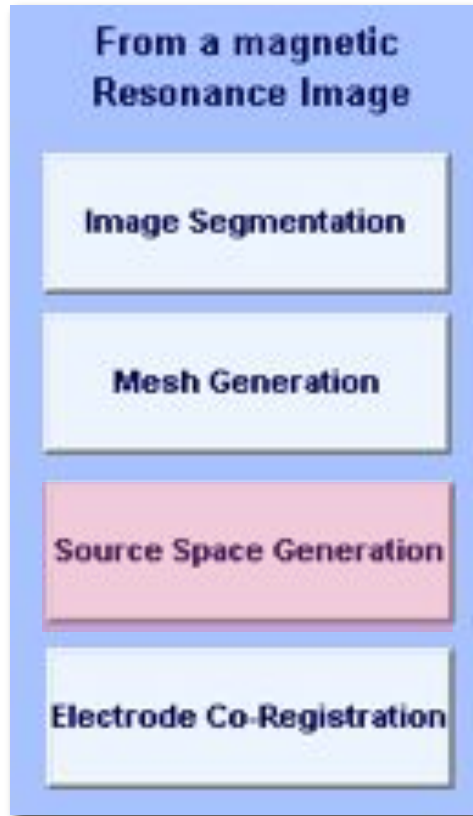
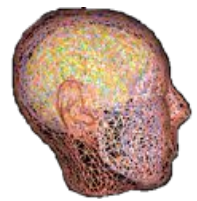
2.0 Edge length/
Distance between meshes

Start Mesh Generation

Status

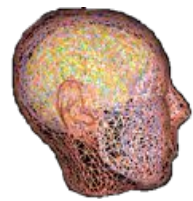
- ◆ Generate a mesh for a 3- or 4-layer BEM head model
 - (triangulation, correction, coarsening, refinement)

Source Space Generation



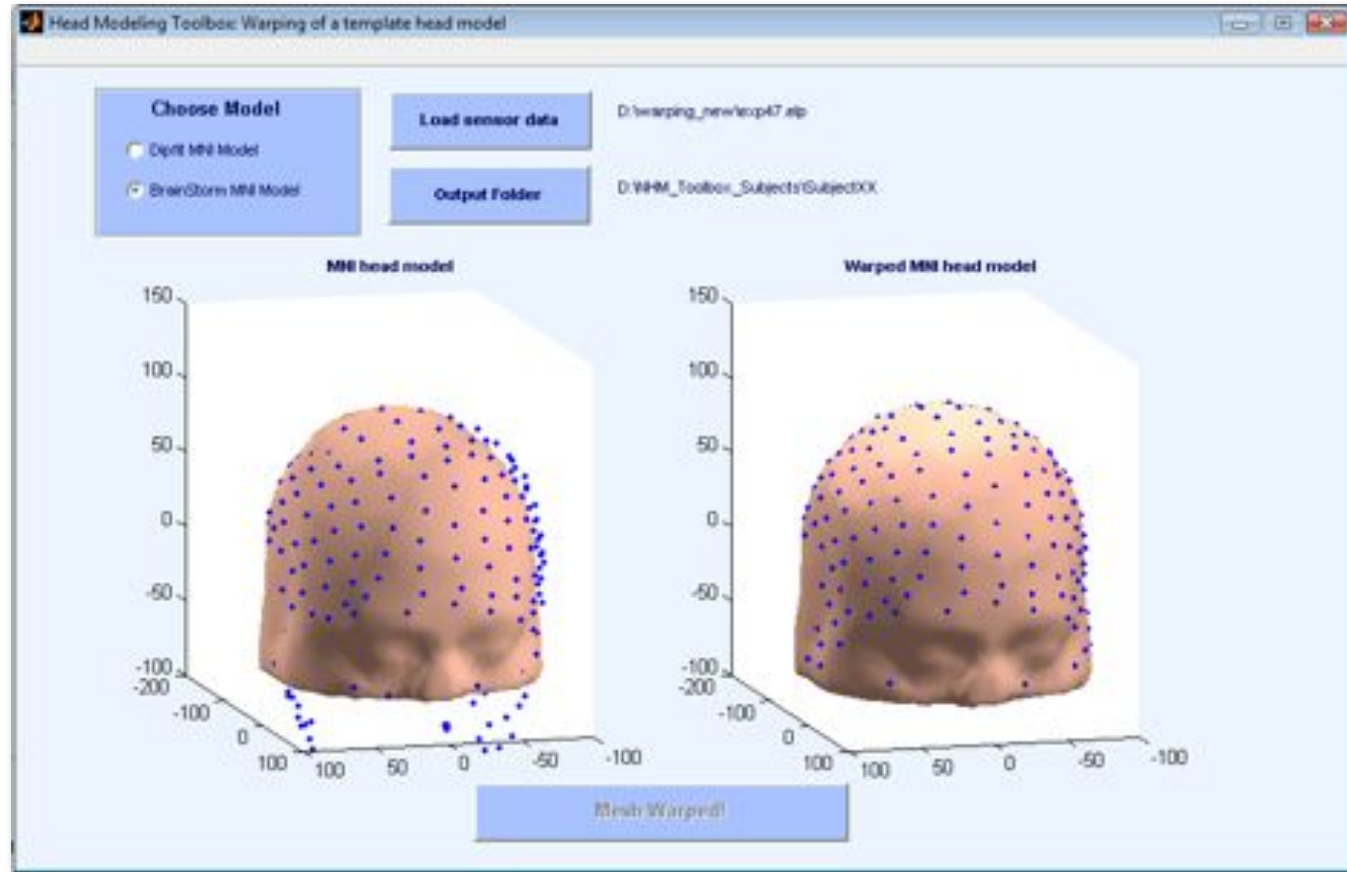
- ◆ Here, generate a simple source space:
 - A regular grid within the brain space
 - with a given spacing & min. dist. to the mesh

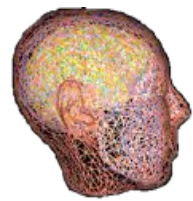
Electrode Position-Based Template Head Warping



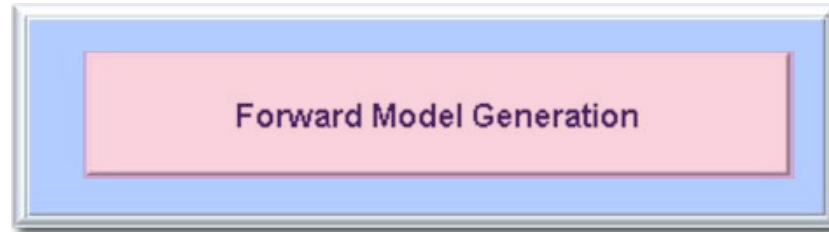
From electrode
Position Data

Template Warping





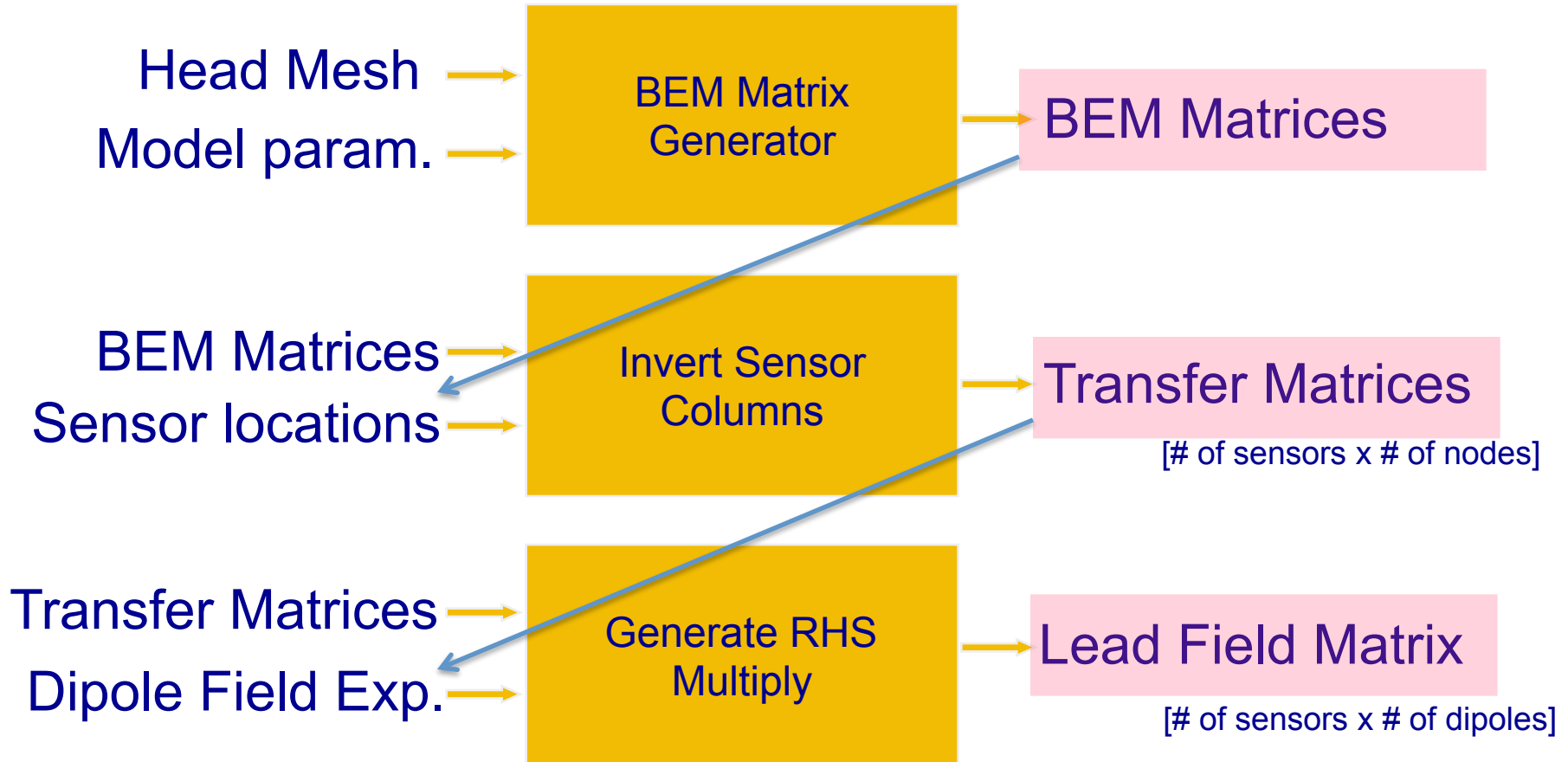
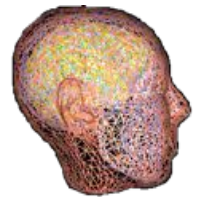
Forward Model Generation



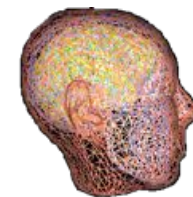
- ◆ Generates the Forward Model from meshes
 - BEM or FEM

- ◆ Generates three structures:
 - Mesh
 - Model (Mesh + Electrical Properties)
 - Session (Model + Sensors)

Forward Problem Solution



Forward Problem Solution



Forward Model Generation

Forward Problem Solution

File

BEM Mesh Info

Mesh Name

Number of Layers

Number of Nodes

Number of Elements

Number of Nodes/Element

BEM Model

Model Name

Enter conductivity values:

Scalp Skull

Brain

☒ Modified (Isolated Problem Approach)

No Model

Session

Session Name

Load Sensors

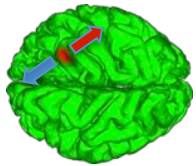
☒ Mesh Node List

☐ Mesh Coordinates

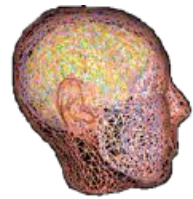
No Session

Forward Problem Solution

For Dipole



A Four-Layer BEM Head Model



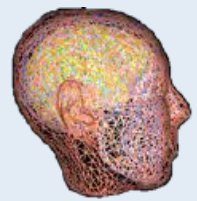
Neuroelectromagnetic
Forward head modeling
Toolbox (NFT)

of elements

Scalp:	6,900
Skull:	6,800
CSF:	9,000
Brain:	8,800

Total	31,500
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Source localization error comparisons



BEM Head Models:

- ◆ 4-layer MR-based realistic BEM head model
- ◆ 3-layer MR-based realistic BEM head model
- ◆ MNI template head model
- ◆ Electrode-warped MNI template head model
- ◆ Spherical BEM head model

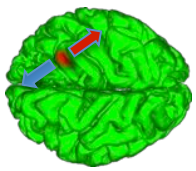
Brain Topogr

DOI 10.1007/s10548-012-0274-6

ORIGINAL PAPER

Effects of Forward Model Errors on EEG Source Localization

Zeynep Akalin Acar • Scott Makeig



Effects of Skull Conductivity Estimation

Measurements of skull conductivity:

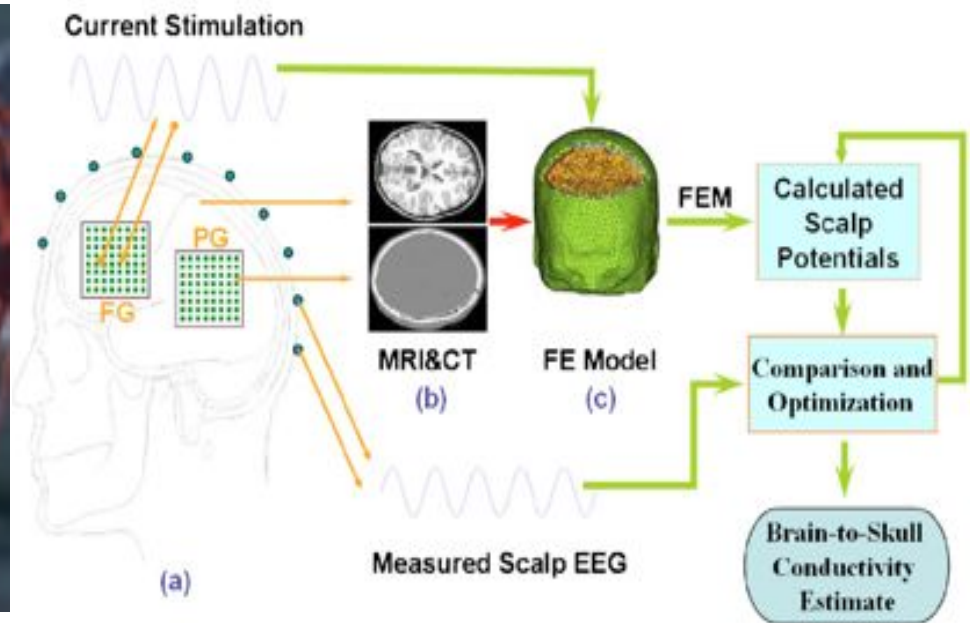
- MR-EIT
- Magnetic stimulation
- Current injection

In vivo

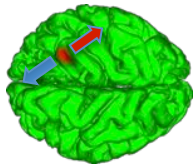


Hoekama et al, 2003

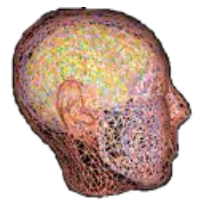
In vitro



He et al, 2005

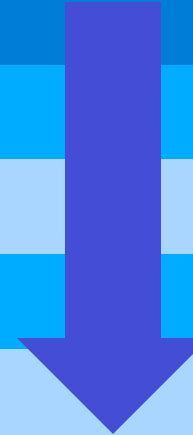


Skull Conductivity Measurements



Brain to skull ratio

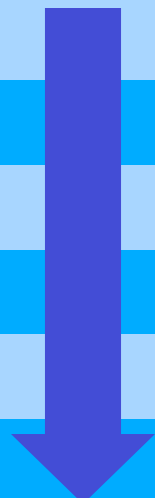
Rush and Driscoll	1968	80
Cohen and Cuffin	1983	80
Oostendorp et al	2000	15
Lai et al	2005	25

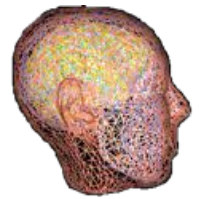
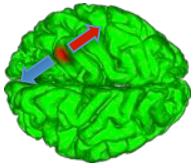


Measurement	Age	σ (mS/m)	Sd (mS/m)
Agar-agar phantom	—	43.6	3.1
Patient 1	11	80.1	5.5
Patient 2	25	71.2	8.3
Patient 3	36	53.7	4.3
Patient 4	46	34.4	2.3
Patient 5	50	32.0	4.5
Post mortem skull	68	21.4	1.3

Skull conductivity
by age

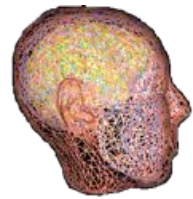
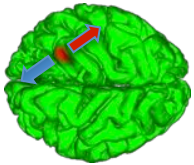
Hoekama et al, 2003





Summary I

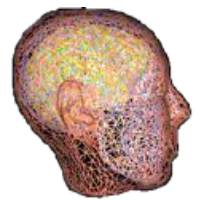
- **Forward modeling**
is required to interpret the scalp topographies
- Interpreting scalp topographies means
inverse modelling or “**source estimation**”
- Mathematical techniques are available
to aid in interpreting scalp topographies
→ These are **inverse source models**



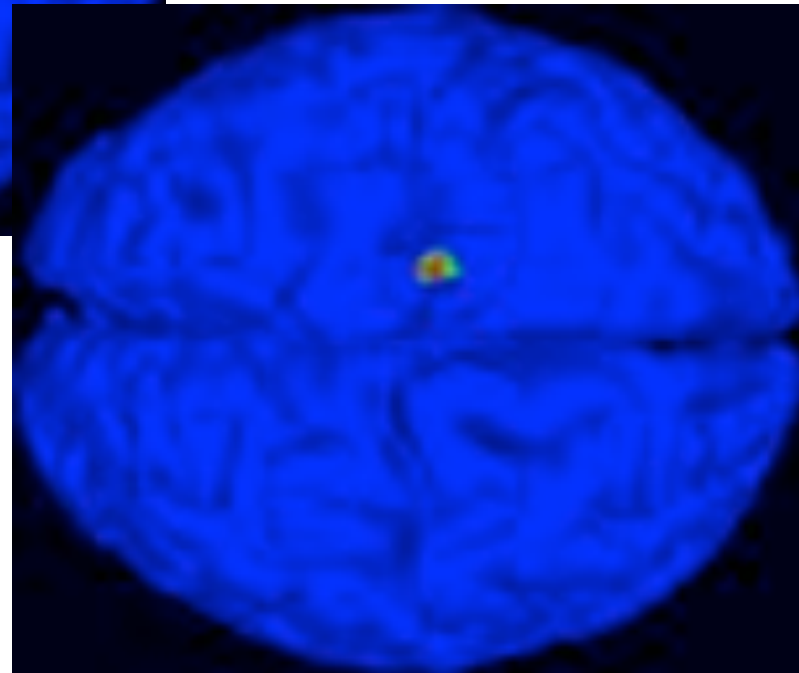
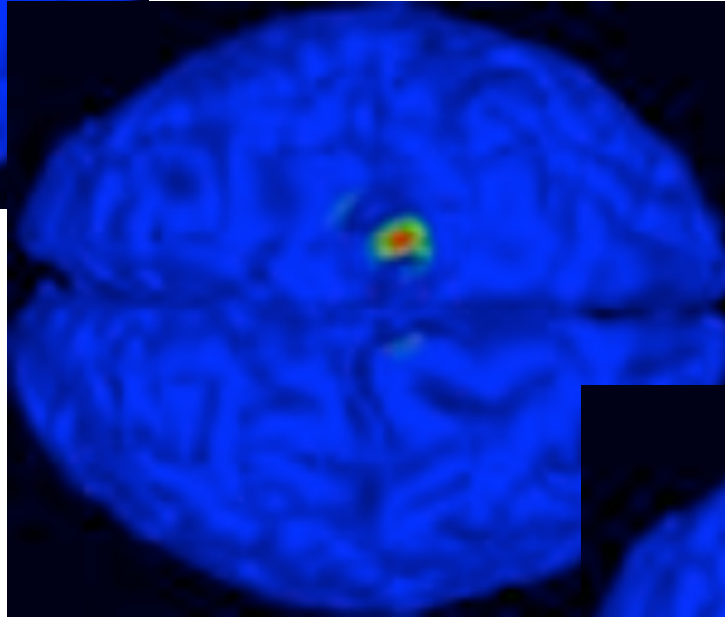
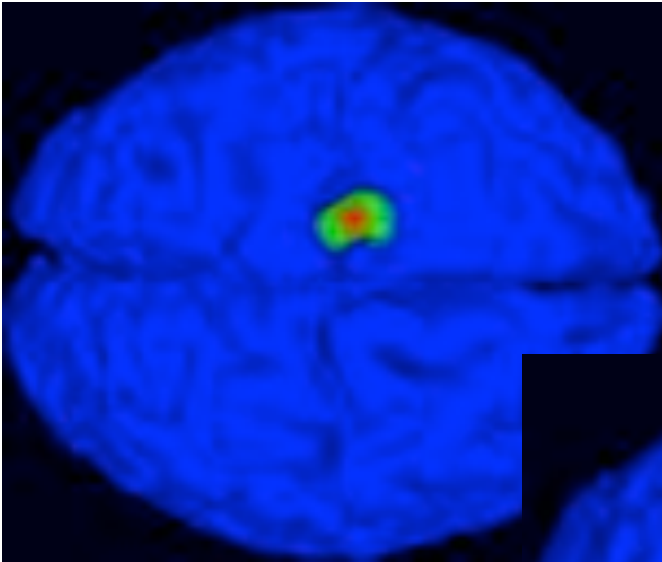
Summary II

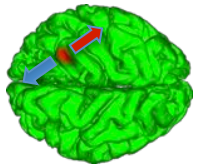
- **Inverse modeling**
 - Model assumptions for the (volume conductor) head
 - Model assumptions for source (equiv. dipole source)
 - Additional assumptions on source location/orientation
- **Single point-like sources**
- **Multiple point-like sources**
- **Distributed sources**
 - Different mathematical solutions
 - Dipole fitting (linear and nonlinear)
 - Linear estimation (regularized)
- **For EEG inverse modeling, conductivity is key!**

Solving inverse problems → NIST



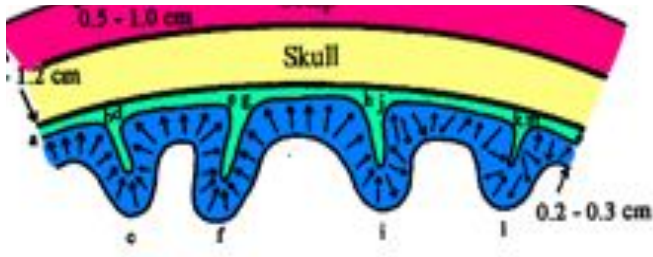
Conformal cortical patch source dictionary





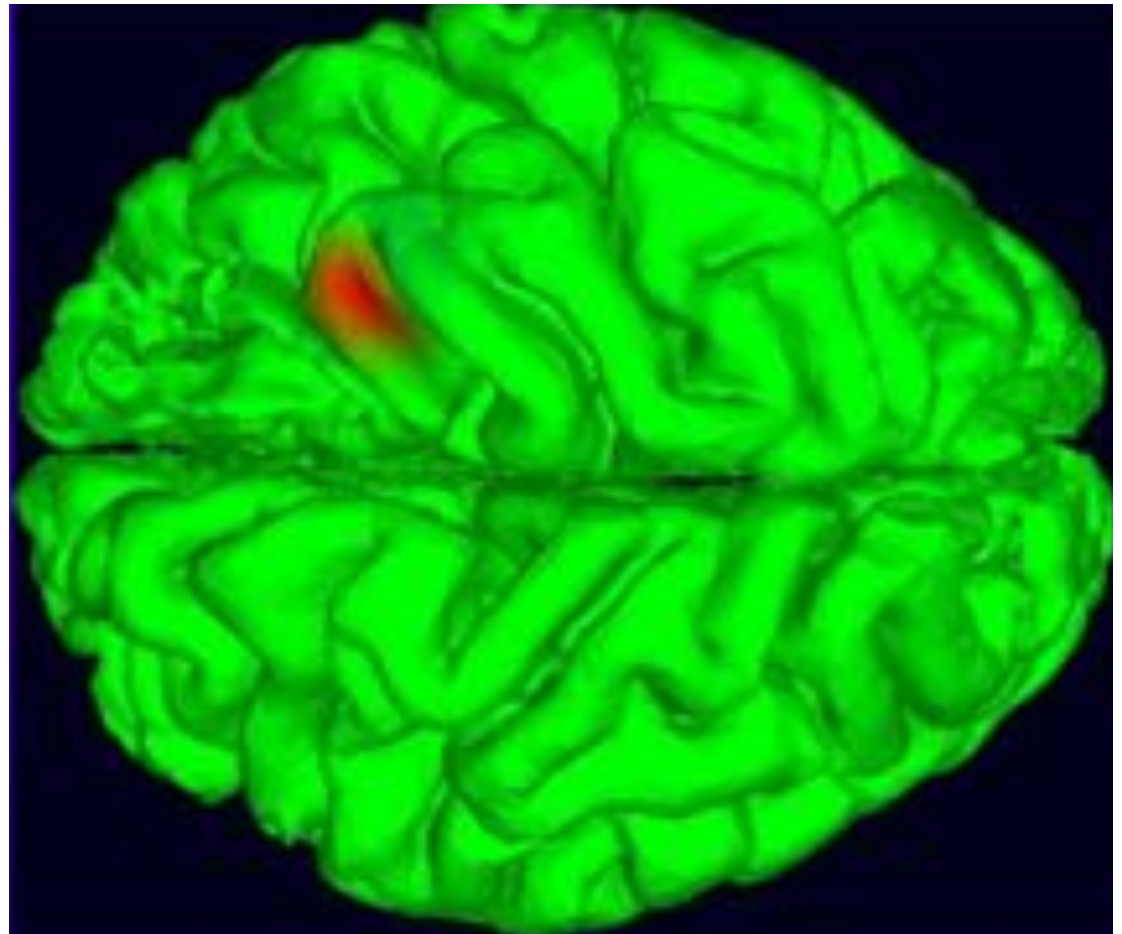
Conformal cortical patch basis model

→ Model a source as a sum of overlapping patches

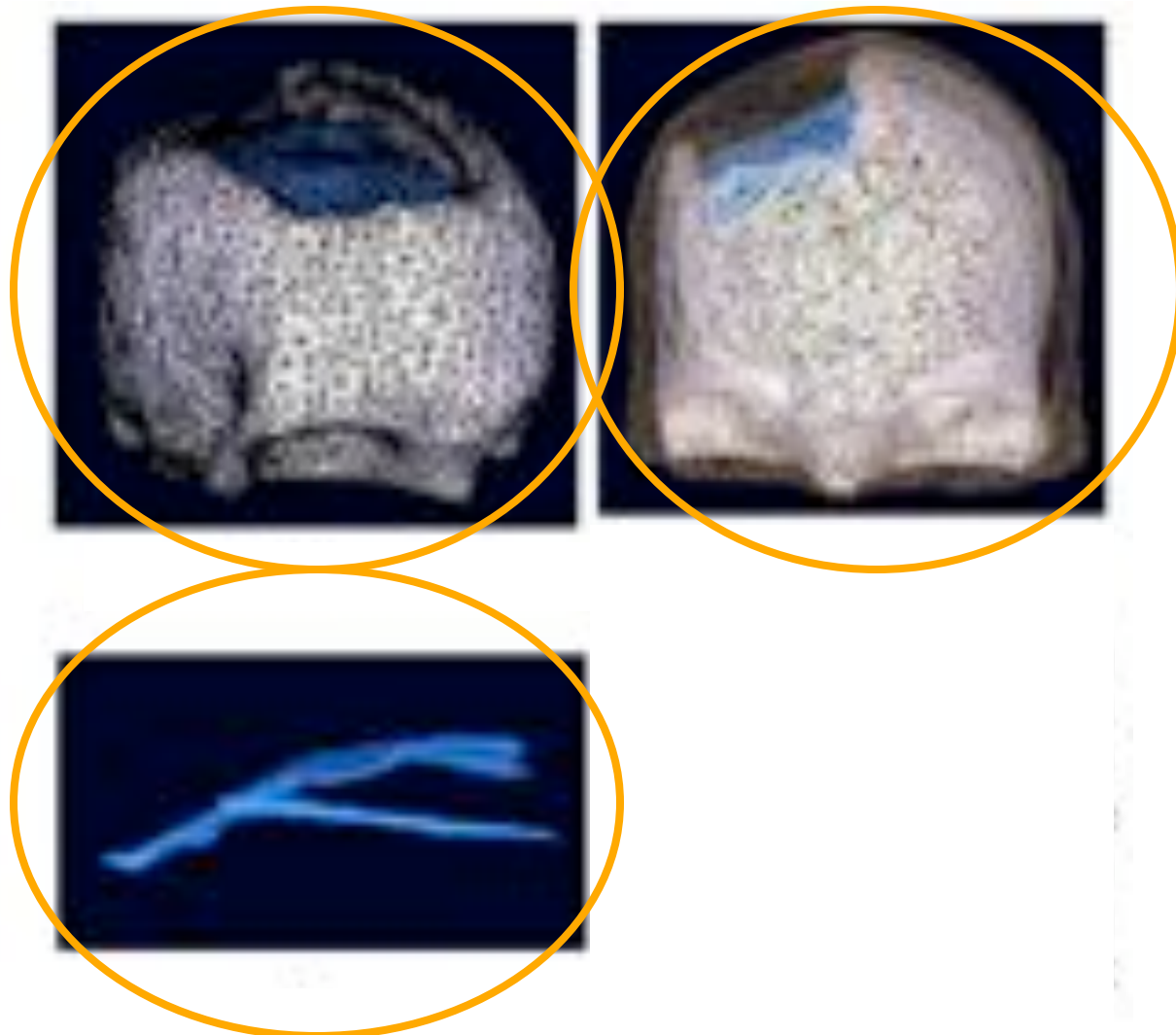


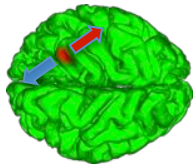
Sparse
Compact
Smooth

- Cheng Cao 2011



Electromagnetic source localization using realistic head models – an intracranial monitoring model

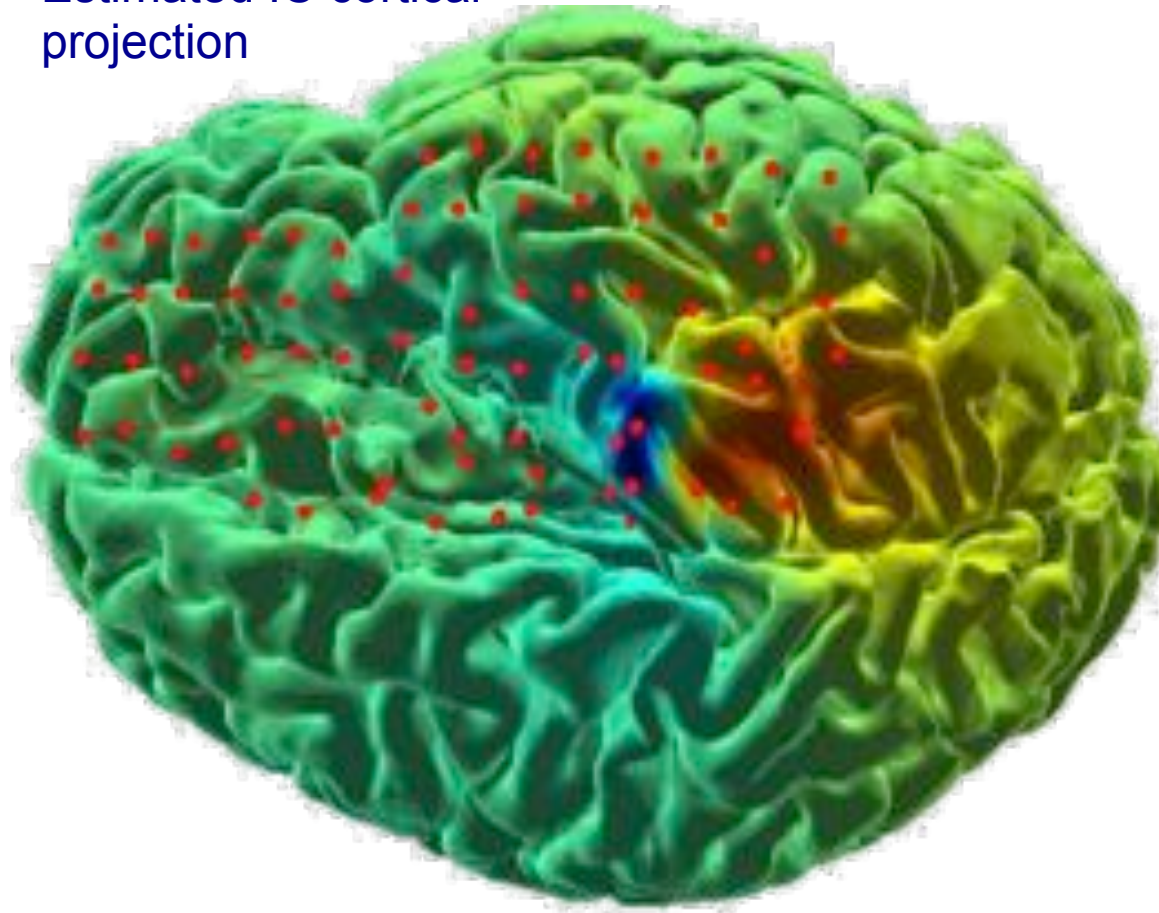




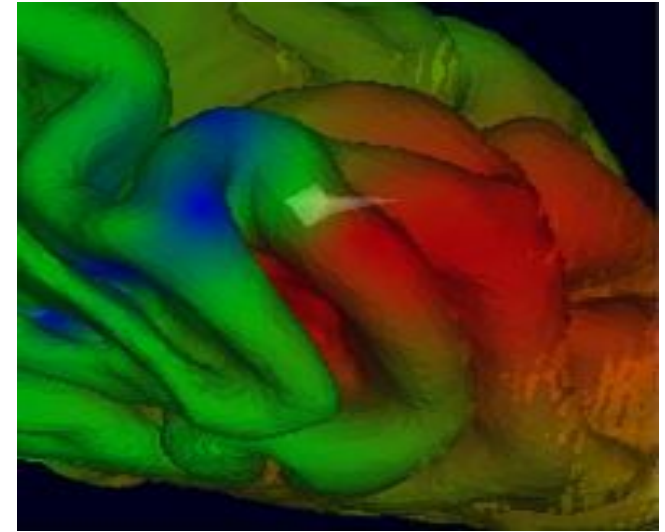
Source models

of an IC from an intracranial data set

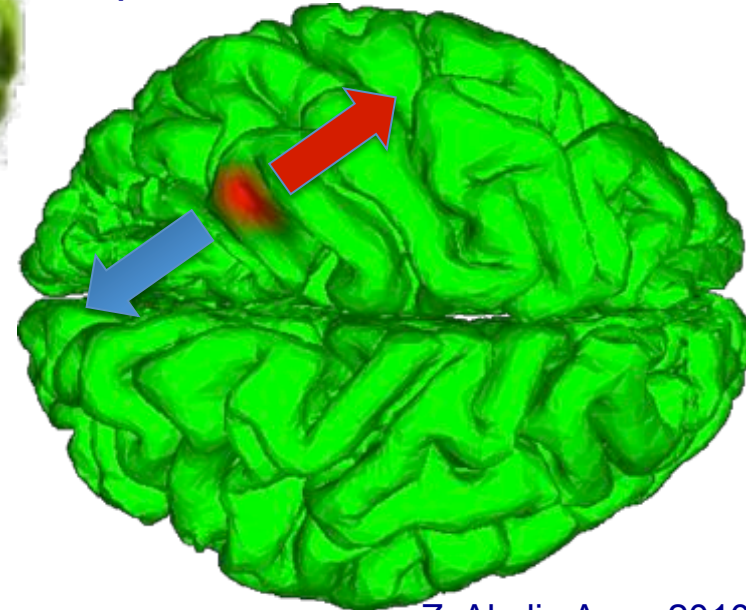
Estimated IC cortical
projection



Equivalent Current Dipole Model



Sparse Patch Basis Model





NFT

Neuroelectromagnetic Forward Head Modeling Toolbox

Zeynep Akalin Acar