

# MEG/EEG source imaging using VBMEG

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- Overview
- Theory
- Usage
- FAQ and News

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## What is VBMEG?

- VBMEG = Variational Bayesian Multimodal EncephaloGraphy
- A MATLAB toolbox for MEG/EEG source imaging



# Main functions





(Yoshioka et al., 2008)

#### Retinotopic map



(Paulun et al., 2018)



#### **Connectome dynamics estimation**



### Advantage

#### **Ability to integrate multimodal measurements**



B Connectome dynamics estimation (Takeda et al., 2019)



fMRI



Current sources



High temporal resolution

High spatial resolution

High spatiotemporal resolution

Estimating source current is ill-posed problem.



Prior information is necessary to reduce solution space.



By using fMRI as prior information, we can obtain source current with high spatial resolution.



# Reliability of VBMEG

#### 8 method studies on VBMEG

(Sato et al., NeuroImage 2004; Yoshioka et al., NeuroImage 2008; Fujiwara et al., NeuroImage 2009; Aihara et al., NeuroImage 2012; Morishige et al., NeuroImage 2014; Fukushima et al., NeuroImage 2015; Sato et al., PLoS One 2018; Takeda et al., Front Neurosci 2019)

#### 14 neuroscience studies using VBMEG

(Shibata et al., Cereb Cortex 2008; Callan et al., NeuroImage 2010; Toda et al., NeuroImage 2011; Yoshimura et al., NeuroImage 2012; Yamagishi et al., PLoS One 2013; Morioka et al., NeuroImage 2014; Takeda et al., PLoS One 2014; Callan et al., Front Hum Neurosci 2016; Ohata et al., Sci Rep 2016; Yanagisawa et al., Nat Commun 2016; Yoshimura et al., Sci Rep 2017; Fukuma et al., Front Neurosci 2018; Mejia et al., Front Neurosci 2018; Filatova et al., Front Neural Circ 2018)

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### References

#### • Source current estimation

Sato M, Yoshioka T, Kajihara S, Toyama K, Goda N, Doya K, Kawato M. Hierarchical Bayesian estimation for MEG inverse problem. Neuroimage. 2004 Nov;23(3):806-26.

吉岡 琢、佐藤 雅昭. 階層変分ベイズ推定法(VBMEG)の原理と応用. 日本神経回路学会誌 2011 Vol. 18, No. 4:214-223. <u>https://www.jstage.jst.go.jp/article/jnns/18/4/18\_4\_214/\_pdf</u>

#### • Connectome dynamics estimation

Fukushima M, Yamashita O, Knösche TR, Sato M. MEG source reconstruction based on identification of directed source interactions on whole-brain anatomical networks. Neuroimage. 2015 Jan 15;105:408-27. <u>https://www.sciencedirect.com/science/article/pii/S1053811914008088?</u> <u>via%3Dihub</u>

Forward model of VBMEG



### Difference from dSPM (Dale et al., 2000)



Forward model of VBMEG















#### α-step



Prior weight	Current variance	
Small	Far from fMRI activity	Sparse
Large	Close to fMRI activity	Dense

### **Connectome dynamics estimation**

Generative model

$$z_{n,t} = \sum_{d=1}^{p} a_{nd} z_{n,t-d} + \sum_{v \in C_n} b_{nv} z_{v,t-\Delta_{v_n}} + \epsilon_n \qquad \Delta_{v_n} = \frac{L_{v,n}}{c} + D$$



Anatomical connectivity derived from dMRI



## **Relation with DCM**



- Linear
- Whole-brain

- Nonlinear
- Few ROIs

# **Connectome dynamics estimation**

Estimation algorithm

• Fukushima et al.'s method (2015)

Current and connectivity are jointly estimated.



Two-step method

After estimating current, connectivity is estimated by the I2-regularized least squares method.



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## How to learn VBMEG's usage

https://vbmeg.atr.jp/document/

- Users manual
- GUI Basic tutorial

Script

- Advanced tutorial
  - Easy VBMEG tutorial
- Neuromag tutorial

- General manual of VBMEG (with function references and tips)
- $MEG \rightarrow Source current$
- $\begin{array}{c} \mathsf{MEG}/\mathsf{EEG} \xrightarrow{} \mathsf{Source\ current} \\ \xrightarrow{} \mathsf{Connectome\ dynamics} \end{array}$

 $EEG \rightarrow Source current$ (without T1 image and sensor location)

 $\begin{array}{c} \mathsf{MEG}/\mathsf{EEG} \to \mathsf{Source\ current} \\ \to \mathsf{Group\ analysis} \\ \to \mathsf{Connectome\ dynamics} \end{array}$ 

# Research topic in Front. Neurosci.

https://www.frontiersin.org/research-topics/5158/from-raw-megeeg-to-publicationhow-to-perform-megeeg-group-analysis-with-free-academic-software#articles



#### Neuromag tutorial

#### https://www.frontiersin.org/articles/10.3389/fnins.2019.00241/full



#### https://vbmeg.atr.jp/docs/v2/static/vbmeg2\_tutorial\_neuromag.html

	Neuromag tutorial		
Conte	ents		
• Cor • 0. 1 • 1. 1 • 2. 5 • 3. N • 4. 1 • 5. N • 6. 0 • 7. 0 • 8. 1 • 9. 0	atents Download Introduction Starting.tutorial dodeling.brain moorting.tMRI.activity. MEG.source_imaging Torup.analysis Torup.analysis Torup.analysis Torup.analysis Torup.analysis Torup.analysis Torup.analysis Torup.analysis Torup.analysis Torup.analysis Torup.analysis		
0. Do	wnload		
• <u>Net</u> • <u>Tut</u>	rromag MEG/EEG data (OpenNEURO ds000117-v1.0.1, Wakeman and Henson, 2015) orial programs. FreeSurfer results, and IMRI activities (tutorial.zip)		
The sam	e Neuromag data can be downloaded also from Amazon S3 by the following command.		
\$ aws	s3 cpno-sign-request s3://openneuro.org/ds000117 ds000117recursive		



#### https://openneuro.org/datasets/ds000117/versions/1.0.1

		PUBLIC SUPPORT DASHBOARD SUPPORT
Versions	≪ @⁺	
00002 2018-07-17 00001 2018-07-17	Multisubject, multimodal face processing uploaded by Richard Henson on 2018-03-30 - over 1 year ago authored by Wakeman, DG, Henson, RN ▲ 47 ● 8847 Download ② Analyze on brainlife.io Files: 20569, Size: 30.13GB, Subjects: 17, Sessions: 10 Available Tasks : facerecognition	BIDS Validation
00003 2018-07-17		🕑 Valid
00004 2018-07-17		Datasat Filo Trac
1.0.0 2018-08-20		Dataset File Iree
1.0.1 2018-08-26		Autisubject, multimodal face processing Julidignore ADOWNLOAD    VIDW acq=rpi_Thw jion ADOWNLOAD    VIEW acq=mprage_Thw jion
1.0.2 2018-10-01 1.0.3 2018-11-27		
	Available Modalities : T1w, dwi, bold, fieldmap	

### Neuromag tutorial



# Neuromag MEG/EEG

- Open dataset recorded by Wakeman and Henson (2015) <u>https://openneuro.org/datasets/ds000117/versions/1.0.1</u>
- MEG and EEG were simultaneously recorded during a face recognition task by Neuromag system.



## Starting VBMEG

#### https://vbmeg.atr.jp/download2/

#### VBMEG – Variational Bayesian Multimodal EncephaloGraphy

ATR Neural Information Analysis Labs., Kyoto, Japan

ATR Links

ATR-BAIC

ATR / ATR-BICR / ATR-NIA-CBI /



• <u>VBMEG v2.1-0-b-2 (372MB)</u>

#### Requirements

- MATLAB version 7 2014a
- MEX files

Almost all the code of VBMEG is implemented as MATLAB M-files, VBMEG also uses a

#### System requirements

OS : Linux

Software : MATLAB (R14–R2014a)

FreeSurfer4.2 or newer SPM8 Modeling brain

Signal processing toolbox M/EEG processing

MRtrix 0.2.1x FSL 4.1 or newer St 5.1 or newer St 4.1 or newer St 4.1 or newer St 4.1 or newer St 4.1 or newer St 5.1 o
- Brain modeling
- Import data
- Estimate source current from MEG
- Group analysis
- Estimate source current from EEG
- Estimate source current from MEG and EEG
- Estimate connectome dynamics

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# Brain modeling

- 1. Import T1 image (convert coordinate system to that of VBMEG)
- 2. Extract cortical surface by FreeSurfer
- 3. Define sources on cortical surface



# VBMEG's coordinate system

RAS, origin = center of T1



+X = Right +Y = Anterior +Z = Superior

# How to define sources

# FreeSurfer's sphere coordinate

# Standard brain (MNI-ICBM152)







Subject brain





We can proceed to group analyses without any transformation.

- Brain modeling
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# Importing data

Supported format: Yokogawa and Neuromag MEG Biosemi and Brainamp EEG

If you have any requests for the supported format, please inform us.

# **Preprocessed MEG**



# Preprocessed EEG



- Brain modeling
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# Estimate source current from MEG

Important parameters

- bayes\_parm.prior\_weight
- bayes\_parm.twin\_meg
- bayes\_parm.twin\_noise
- bayes\_parm.trial\_average

# bayes\_parm.prior\_weight



### In Neuromag tutorial, bayes\_parm.prior\_weight = 0.3

# bayes\_parm.twin\_meg



In Neuromag tutorial





# bayes\_parm.trial\_average

This parameter determines whether noise covariance and current variances are calculated from trialaveraged data.

We highly recommend

bayes\_parm.trial\_average = OFF (default)

## Estimated source current from MEG



# Comparison with other methods



Thanks to fMRI and ARD priors, VBMEG's source current is localized around visual processing areas.

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# Group analysis

### **Detect face-selective activity**

Face



## Scrambled



# No transformation is necessary



# Caution

Absolute values (or powers) of currents should be used.

### In Neuromag tutorial

- Calculate stimulus-triggered average of currents
- Normalize it so that baseline period (-0.3–0 s) has mean 0 and SD 1
- Calculate amplitude
- For each source and time, compared 16 subjects' amplitudes between face and scrambled conditions
- Multiple comparison problem is controlled by False Discovery Rate (FDR)

# Group analysis result

Face - Scrambled



# Comparison with other methods



- Brain modeling
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## Estimating source current from EEG

## Caution

We need to take a reference from EEG and its leadfield.

### In Neuromag tutorial

```
% Take common average
> basis_file = fullfile(p.proj_root, basis_parm.basis_file);
> load(basis_file, 'basis')
> for v = 1:size(basis, 1);
    basis(v, :) = basis(v, :)-mean(basis(v, :), 2);
> end
> vb_save(basis_file, 'basis');
```

## Estimating source current from EEG

Default conductivities are set to

Brain, Skull, Scalp 0.62, 0.03, 0.62 S/m



# Estimated source current from EEG



- Brain modeling
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# Estimating source current from MEG and EEG

## MEG and EEG have different sensitivities.



From Fujiwara-san's slide

# Estimating source current from MEG and EEG

Combining MEG and EEG improves the estimation accuracy of source current.



From Fujiwara-san's slide

# Estimated source current from MEG and EEG



- Brain modeling
- Import data
- Estimate source current from MEG
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# Estimate connectome dynamics

## 1. Estimate anatomical connectivity



2. Estimate connectome dynamics

$$z_{n,t} = \sum_{d=1}^{p} a_{nd} z_{n,t-d} + \sum_{v \in C_n} b_{nv} z_{v,t-\Delta_{v_n}} + \epsilon_n \qquad \Delta_{v_n} = \frac{L_{v,n}}{c} + D$$

# Estimate anatomical connectivity

## Necessary software: MRtrix 0.2.1x FSL 4.1 or newer

Procedure

1. Parcellation

2. Fiber tracking

3. Thresholding





# Estimate connectome dynamics

1. Estimate connectome dynamics by l2-regularized least squares method  $z_{n,t} = \sum_{d=1}^{p} a_{nd} z_{n,t-d} + \sum_{v \in C_n} b_{nv} z_{v,t-\Delta_{v_n}} + \epsilon_n \qquad \Delta_{v_n} = \frac{L_{v,n}}{c} + D$ 

(default) p = 2, c = 6 m/s, D = 27 ms

2. Generate a movie displaying signal flows
#### Generated movie



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- How to determine prior weight
- Brodmann area labels are strange
- Optically-pumped magnetometer

- I don't have fMRI
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## I don't have fMRI



 Use uniform prior by setting bayes\_parm.act\_key = 'Uniform' bayes\_parm.prior\_weight = very small value (e.g. 0.0001)

Or

Use meta-analysis results of fMRI studies



Suzuki-kun's talk



## I don't have any data~

#### Please use our dataset (n=5)!



#### https://bicr-resource.atr.jp/mulds/

- I don't have fMRI
- How to determine prior weight
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### How to determine prior weight

Simulation test conducted by Suzuki-kun



prior weight = 0.3 is good

#### How to determine prior weight

Practically, try prior weights from 0.01 to 0.3 by few subjects' data and determine the prior weight which provide reasonable result.

- I don't have fMRI
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## Brodmann area labels are strange

#### BA4 in \*\_brodmann.area.mat





(https://en.wikipedia.org/wiki/Brodmann\_area\_4)

- Left-right asymmetry
- Bad location

#### Causes

Removing island made scattered area small



• Bad matching between voxel and surface



## Solution

#### Import FreeSurfer's label file

FreeSurfer's label file (aparc.annot)



VBMEG brain model (80000 vertices)





## New area files in new VBMEG

\*\_Destrieux.area.mat

\*\_Desikan-Killany.area.mat

\*\_Yeo2011\_7Networks\_N1000 .area.mat

\*\_Yeo2011\_17Networks\_N100 0.area.mat



#### To be removed area file





- I don't have fMRI
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## **Optically-Pumped Magnetometer**

Sensor







- Closer to the brain
- No maintenance cost
- Subject can move

### Future plan

# Estimate source current from simultaneous recordings of OPM and EEG



## Summary of VBMEG' advantages



B Connectome dynamics estimation

## Limitation

VBMEG does not support source imaging from resting-state MEG/EEG.



#### Thank you for your attention!