

Analysis of Functional Magnetic Resonance Imaging (fMRI) Resting-State Brain Activity – ALFF/fALFF and ReHo

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Teaching Materials

• http://www.ym.edu.tw/~cflu/CFLu_course_fmRlana.html

• **Week 9: Resting-State Brain Activity**

• <Handout> [Lesson9_slides.pdf](#)

<Materials> [fMRlana09_materials.zip](#)

Employed Software

• **MRICro**

• <https://people.cas.sc.edu/rorden/mricro/mricro.html#Installation>

• <https://www.mccauslandcenter.sc.edu/crnl/mricro>

• **Statistical Parametric Mapping (SPM 12)**

• <http://www.fil.ion.ucl.ac.uk/spm/>



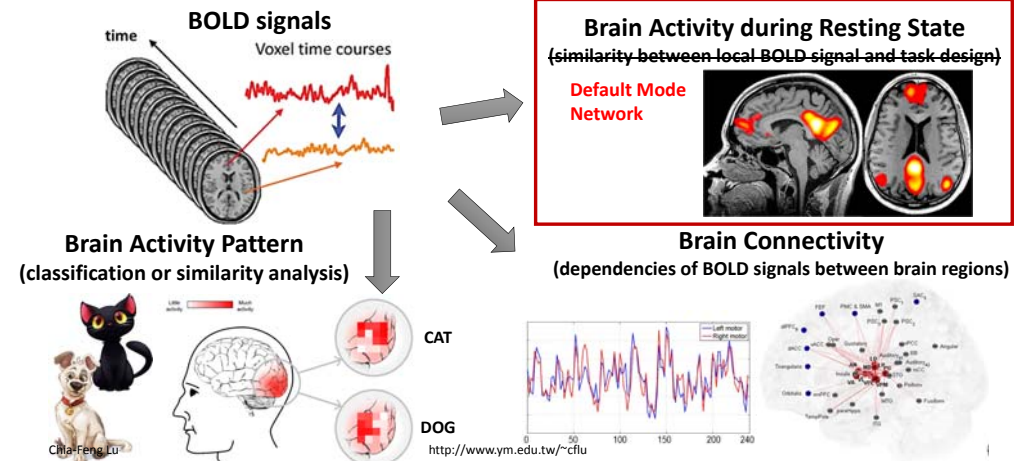
• **Data Processing & Analysis for Brain Imaging (DPABI)**

• <http://rfmri.org/dpabi>



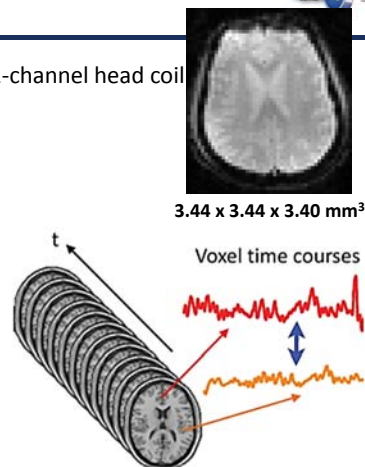
[Caution] File name\path contains Chinese character or space may cause error!

fMRI Analysis



fMRI Protocol

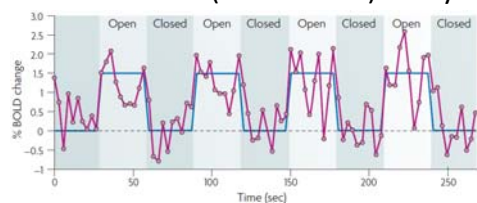
- Siemens 3T MAGNETOM Trio Scanner @ NYMU, 32-channel head coil
- Single-Shot 2D EPI (GRE-EPI), T2* weighting
- Repetition Time = 2000 ms
- Echo Time = 20 ms
- Flip Angle = 70~90°
- NEX = 1
- Slice thickness = 3.4 mm
- Field of View = 220 x 220 mm²
- Matrix size = 64 x 64
- Slice number = 40
- Volume number (**depends on experiment design**)



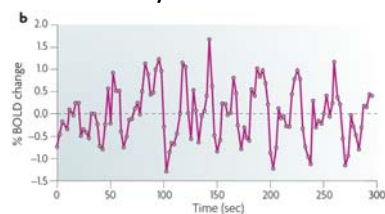
Resting-State fMRI

Spontaneous Fluctuation

- **Task-specific fMRI**
- ✓ Model-based Analysis
- ✓ Model-free (data-driven) Analysis



- **Resting-state fMRI (rs-fMRI)**
- ✓ Model-free (data-driven) Analysis

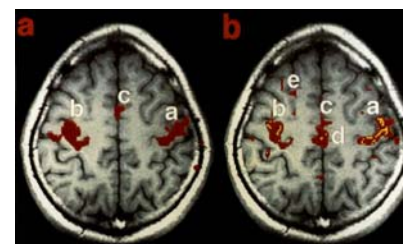


Nature Reviews Neuroscience 8.9 (2007): 700-711.

First rs-fMRI Article (MRM 1995)

Functional Connectivity in the Motor Cortex of Resting Human Brain Using Echo-Planar MRI

Bharat Biswal, F. Zerrin Yetkin, Victor M. Haughton, James S. Hyde



(red: positive, yellow: negative)

Rs-fMRI Analyses

1. Depicting local features of BOLD signal

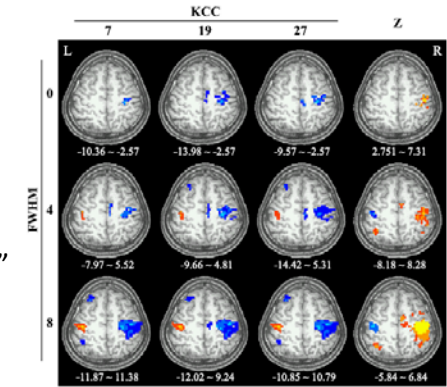
- Regional homogeneity (**ReHo**; Zang et al., NeuroImage 2004)
- Amplitude of low-frequency fluctuation (**ALFF**; Zang et al., Brain & Development 2007)
- Fractional ALFF (**fALFF**; Zou et al., J Neurosci Methods 2008)

2. Functional connectivity analysis

- Linear correlation
- Granger causality analysis (**GCA**), effective connectivity
- Independent component analysis (**GIFT-ICA**; Calhoun et al., NeuroImage 2001)

What does ReHo represent?

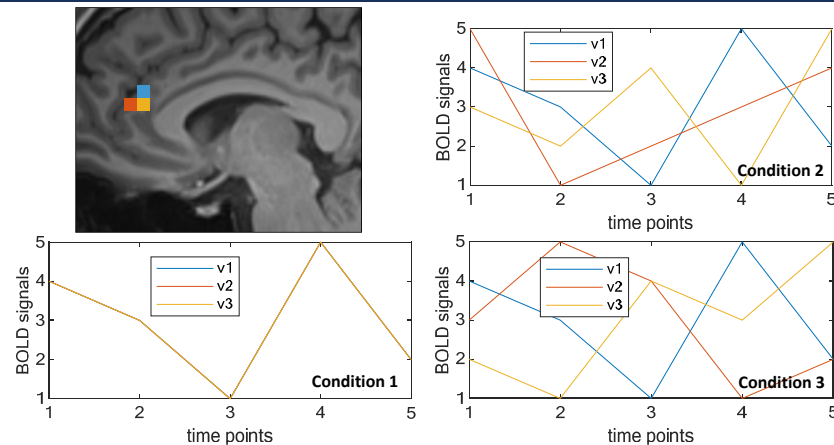
- Regional homogeneity, temporal similarity between neighbor voxels within a small cluster.
- “ReHo supposed that voxels within a functional brain area were more temporally homogeneous when this area is involved in a specific condition.”
- Model-free, data-driven ReHo can reflect cortical activation.



Zang et al., NeuroImage 2004.

KCC: Kendall's coefficient of concordance

Measuring similarity between local signals



An example of ReHo (KCC)

Condition 1

rank	OBJECTS				
	i: 5 time points (number of ranks)				
	n=5				
JUDGES	4	3	1	5	2
j: 3 voxels within a cluster	4	3	1	5	2
K=3	4	3	1	5	2
	$R_1=12$	$R_2=9$	$R_3=3$	$R_4=15$	$R_5=6$

$$R_i = \sum_{j=1}^K r_{i,j}$$

$$\bar{R} = \frac{1}{n} \sum_{i=1}^n R_i$$

$$S = \sum_{i=1}^n (R_i - \bar{R})^2$$

$$W = \frac{12S}{K^2(n^3 - n)}$$

$$\bar{R} = 9, S = 90$$

$$W = \frac{12 \times 90}{9(125 - 5)} = 1 \rightarrow \text{unanimous measurements}$$



An example of ReHo (KCC)

Condition 2

JUDGES (j: 3 voxels within a cluster)

OBJECTS (i: 5 time points (number of ranks) n=5)

rank	4	3	1	5	2
4	5	1	2	3	4
3	3	2	4	1	5

K=3

$R_1=12, R_2=6, R_3=7, R_4=9, R_5=11$

$$R_i = \sum_{j=1}^K r_{i,j}$$

$$\bar{R} = \frac{1}{n} \sum_{i=1}^n R_i$$

$$S = \sum_{i=1}^n (R_i - \bar{R})^2$$

$$W = \frac{12S}{K^2(n^3 - n)}$$

$\bar{R} = 9, S = 24$

$W = \frac{12 \times 24}{9(125 - 5)} = 0.27 \rightarrow$ **Lower concordance**



An example of ReHo (KCC)

Condition 3

JUDGES (j: 3 voxels within a cluster)

OBJECTS (i: 5 time points (number of ranks) n=5)

rank	4	3	1	5	2
3	3	5	4	1	2
2	2	1	4	3	5

K=3

$R_1=9, R_2=9, R_3=9, R_4=9, R_5=9$

$$R_i = \sum_{j=1}^K r_{i,j}$$

$$\bar{R} = \frac{1}{n} \sum_{i=1}^n R_i$$

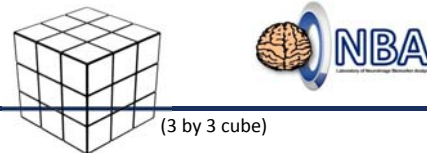
$$S = \sum_{i=1}^n (R_i - \bar{R})^2$$

$$W = \frac{12S}{K^2(n^3 - n)}$$

$\bar{R} = 9, S = 0$

$W = \frac{12 \times 0}{9(125 - 5)} = 0 \rightarrow$ **Total disagreement**

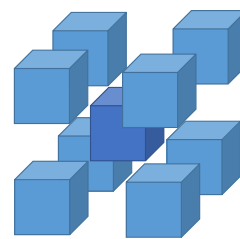
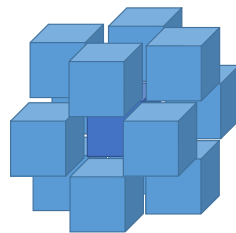
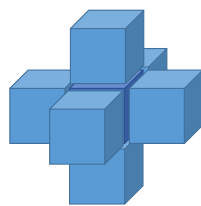
Neighbors & Cluster size



Surface connected (6)

Edge connected (12)

Corner connected (8)



6+1=7-voxel cluster

6+12+1=19-voxel cluster

6+12+8+1=27-voxel cluster

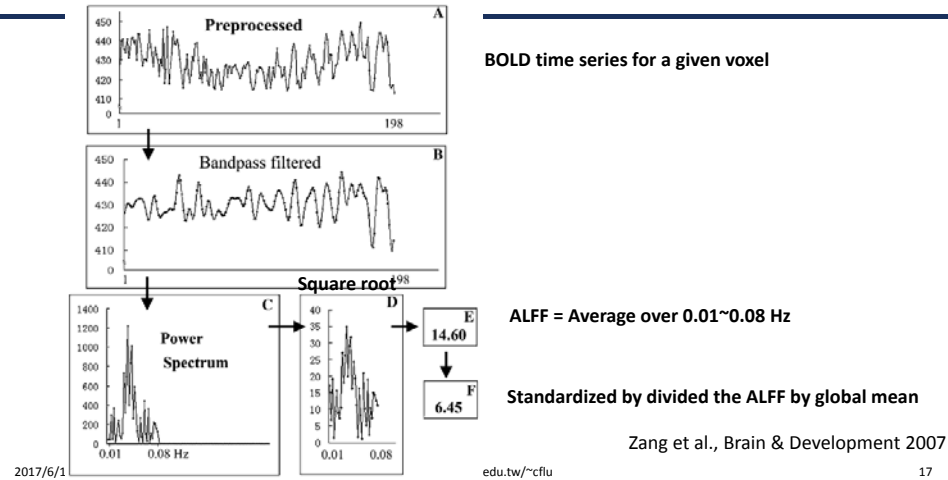


What does ALFF represent?

- Regional activation (regional activity during resting state) measured by the amplitude of low frequency fluctuation (ALFF).
- Regional spontaneous neural activity
 - **Kiviniemi et al. [22] reported activation in the visual cortex due to low-frequency fluctuations at about 0.034 Hz using the power spectrum method.**
 - ALFF is higher in grey matter than in white matter (Biswal et al., 1995).
- ReHo and functional connectivity analyses focus on the similarities of intra- and inter-regional time series, respectively, and ALFF measures the amplitude of regional activity.

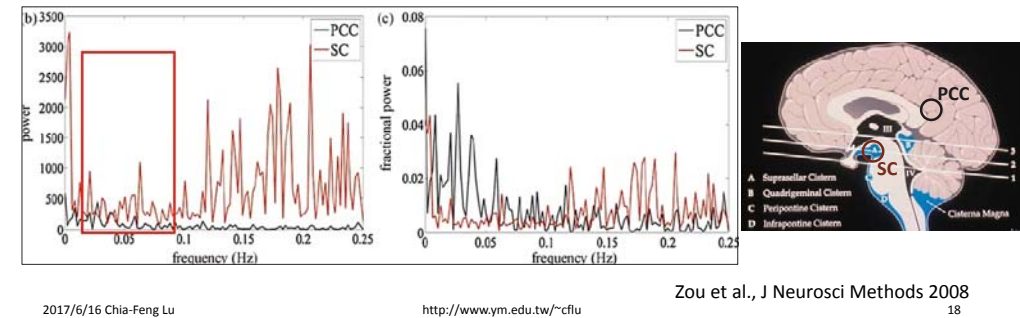
Zang et al., Brain & Development 2007

ALFF flowchart



Fractional ALFF (fALFF)

- The ALFF is sensitive to the physiological noise.
- A fractional ALFF (fALFF) approach, i.e., the ratio of power spectrum of low-frequency (0.01–0.08 Hz) to that of the entire frequency range.



DPABI Toolbox

Introduction and Usage

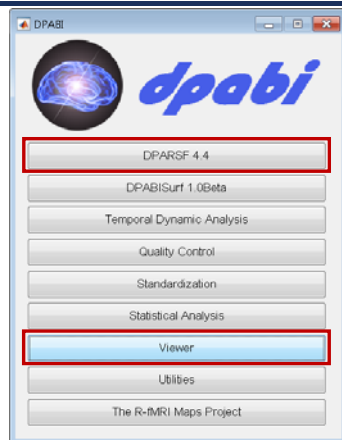
Related Publications

Chao-Gan Yan, et al.

- **DPABI**: Data Processing & Analysis for (resting-state) Brain Imaging, Neuroinformatics 2016 (**more than 300 citations**)
- **DPARSF**: a MATLAB toolbox for "pipeline" data analysis of resting-state fMRI, Frontiers in systems neuroscience, 2010 (**more than 1700 citations**)

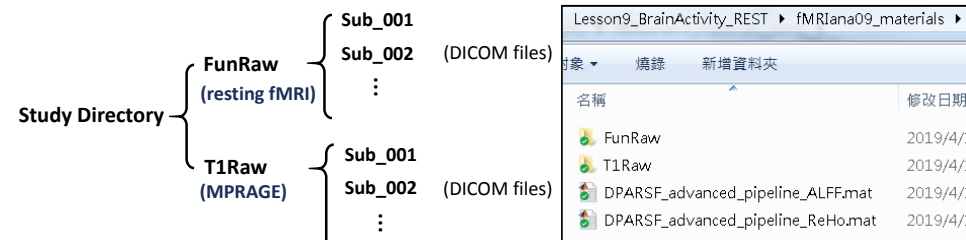
DPABI

- DPABI is evolving from DPARSF, which is based on SPM.
 - **fMRI preprocessing pipeline** (slice timing, realign, segment, normalize, and smooth).
 - **rs-fMRI analyses** (ALFF/fALFF, ReHo, degree centrality, and functional connectivity)
- Online videos
 - http://rfmri.org/WebinarCourse_20160125



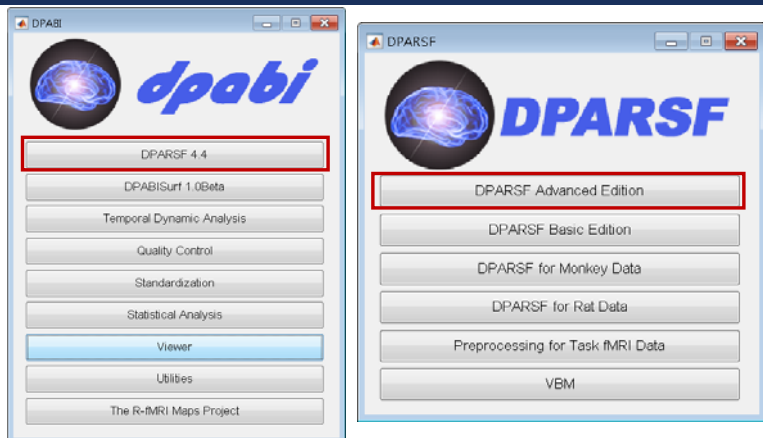
Step 1: Data Organization

- Before using DPABI toolbox, you have to organize subject data by the following way,



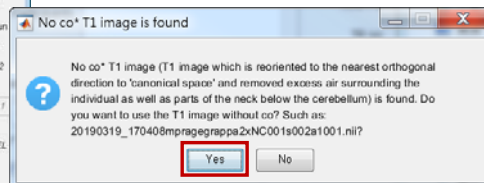
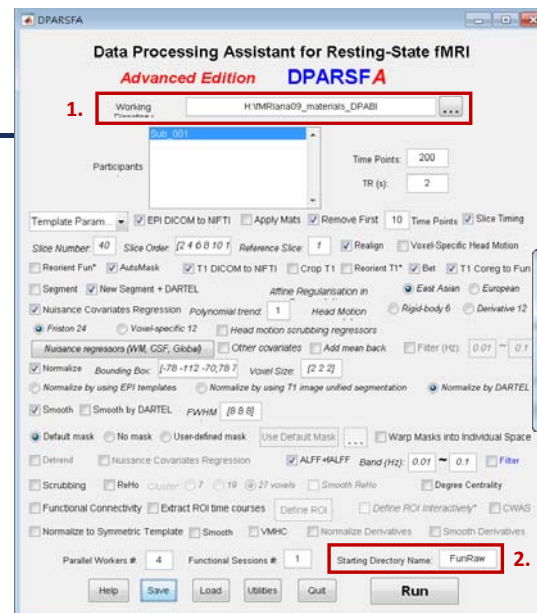
Step 2: Pipeline Setup

Include DPABI_V4.0_190305 path and key in **dpabi** in MATLAB command window



Step 2: Pipeline Setup

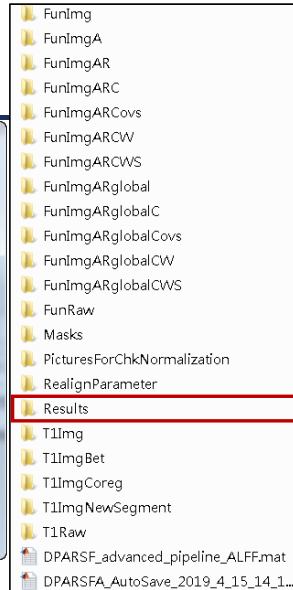
Takes 10~20 minutes for each subject



DPARSF_advanced_pipeline_ALFF.mat
DPARSF_advanced_pipeline_ReHo.mat
 (Data should not be smoothed before ReHo)

Step 3: Review Results

Congratulations, the running of DPARSFA is done!!! :)

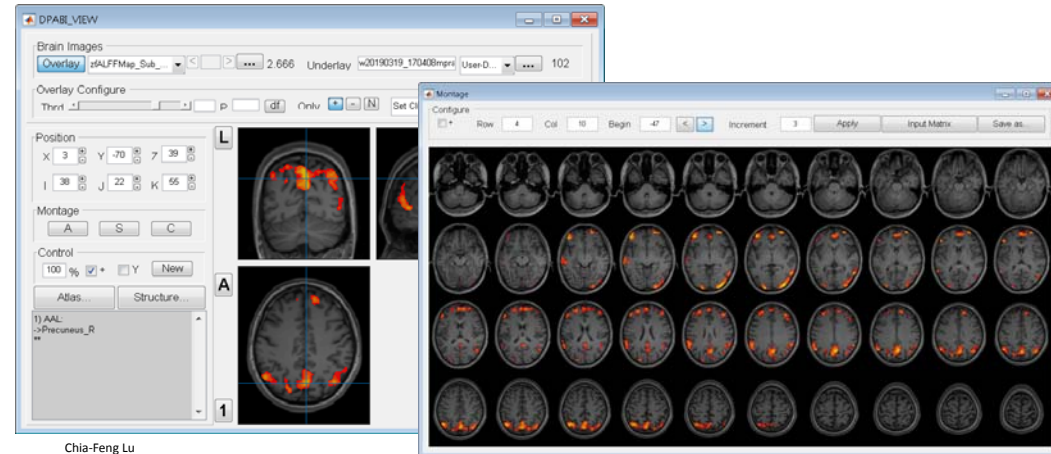


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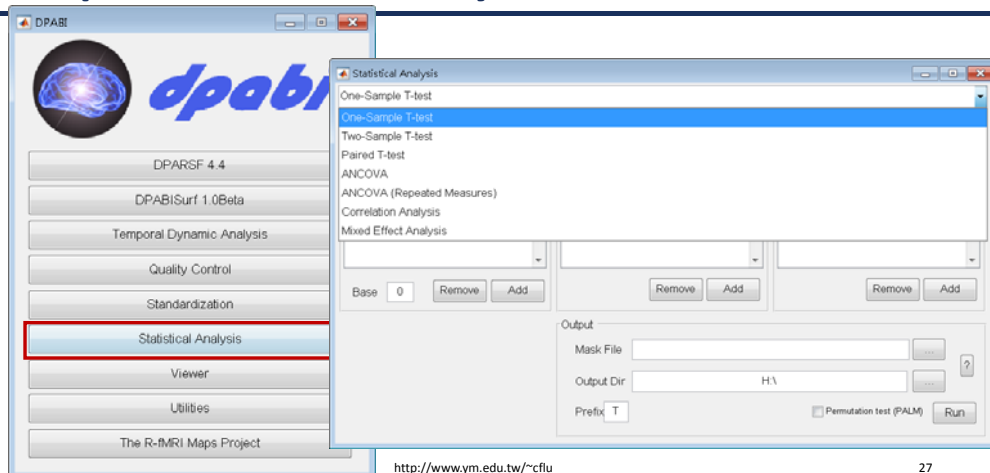
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Step 3: Review Results



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Step 4: Statistical Analysis



<http://www.ym.edu.tw/~cflu>

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Common Errors When using DPABI



- No Chinese character or space is allowed in the file path.
- Please install parallel computing toolbox in MATLAB (e.g., R2019a didn't install this toolbox by default).
- For MAC OS, FreeSurfer is demanded for perform BET process.

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<http://www.ym.edu.tw/~cflu>

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THE END

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Teaching Materials: http://www.ym.edu.tw/~cflu/CFLu_course_fMRIana.html