



# Effective EEG Connectivity Analysis of Episodic Memory Retrieval

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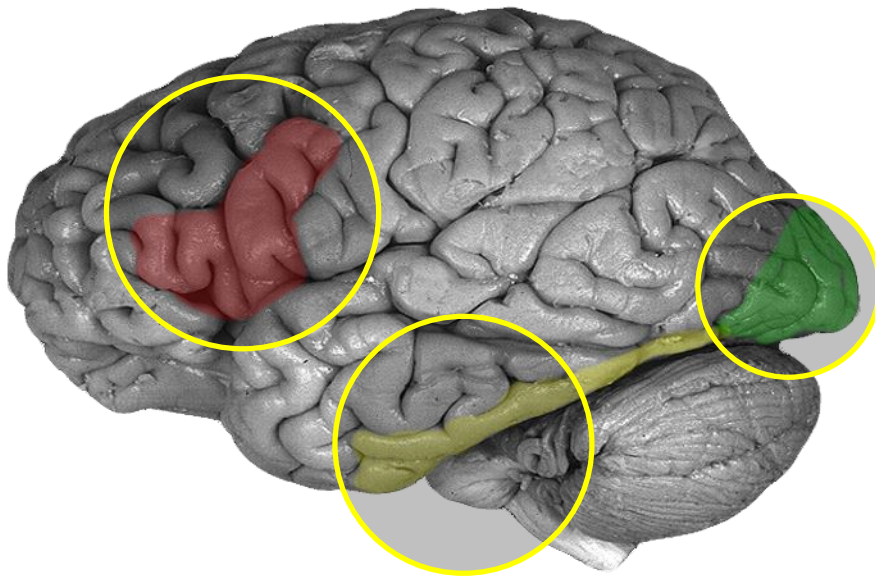
# Talk Outline

- **Background**
- **Research Goals**
- **Methods**
- **Experimental Results**
- **Conclusion & Discussion**

# Background

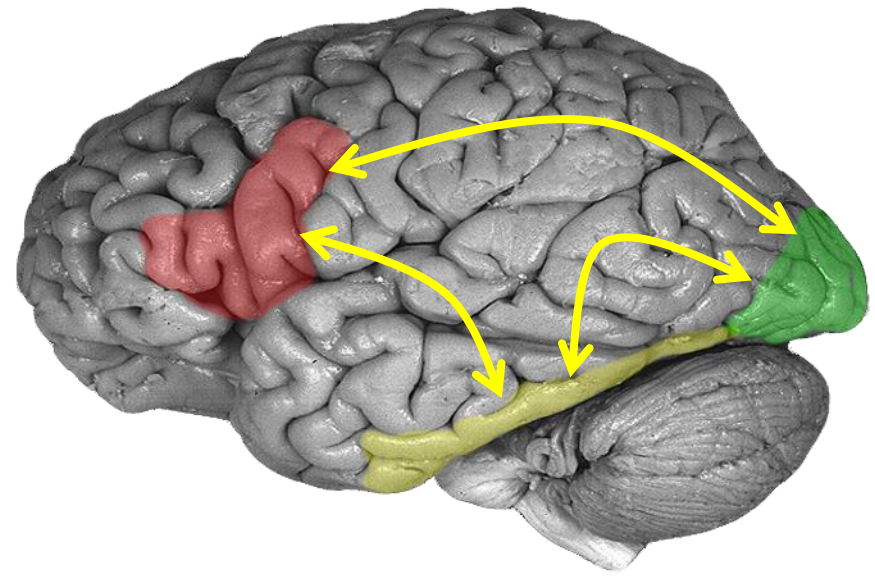
- **Functional Segregation:**

Different areas of the brain are specialized for different functions



- **Functional Integration:**

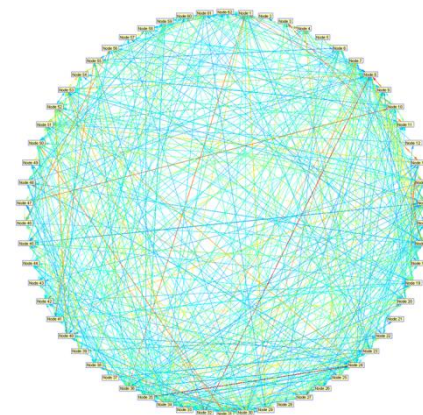
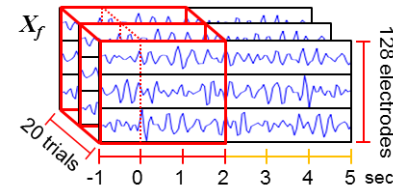
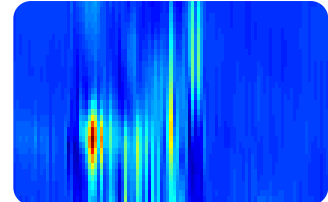
Networks of interactions among specialized areas → **Connectivity**



※ Hanneke den Ouden 2009, *SPM Course at Zurich*

# Research Goals

- **To study the information flows of the human brain network**
  - During episodic memory retrieval
  - Partial and direct information within the human brain
- **Based on effective connectivity measured from EEG**
  - Source localization technique for estimating the activity of the neuronal sources
  - The strength and spectro-anatomical patterns of the inter-areal interactions
  - Direct directed transfer function
  - Time-varying multivariate autoregressive model
- **Graph theoretical analysis**
  - Topological interactions across the brain regions



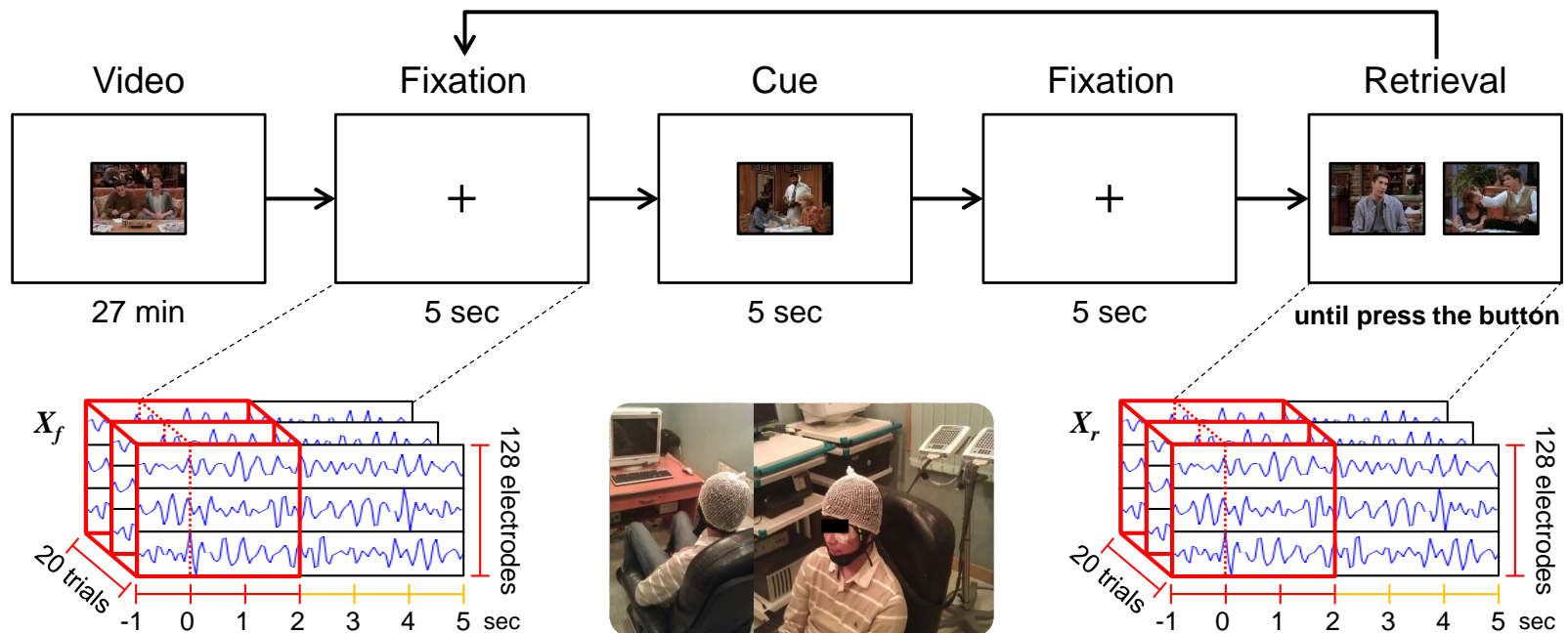
# Methods

## ■ Behavioral Task

- The episodic memory retrieval game after watching a video
- Participants decide whether the order of the two presented images are correct or incorrect.

## ■ EEG Acquisition

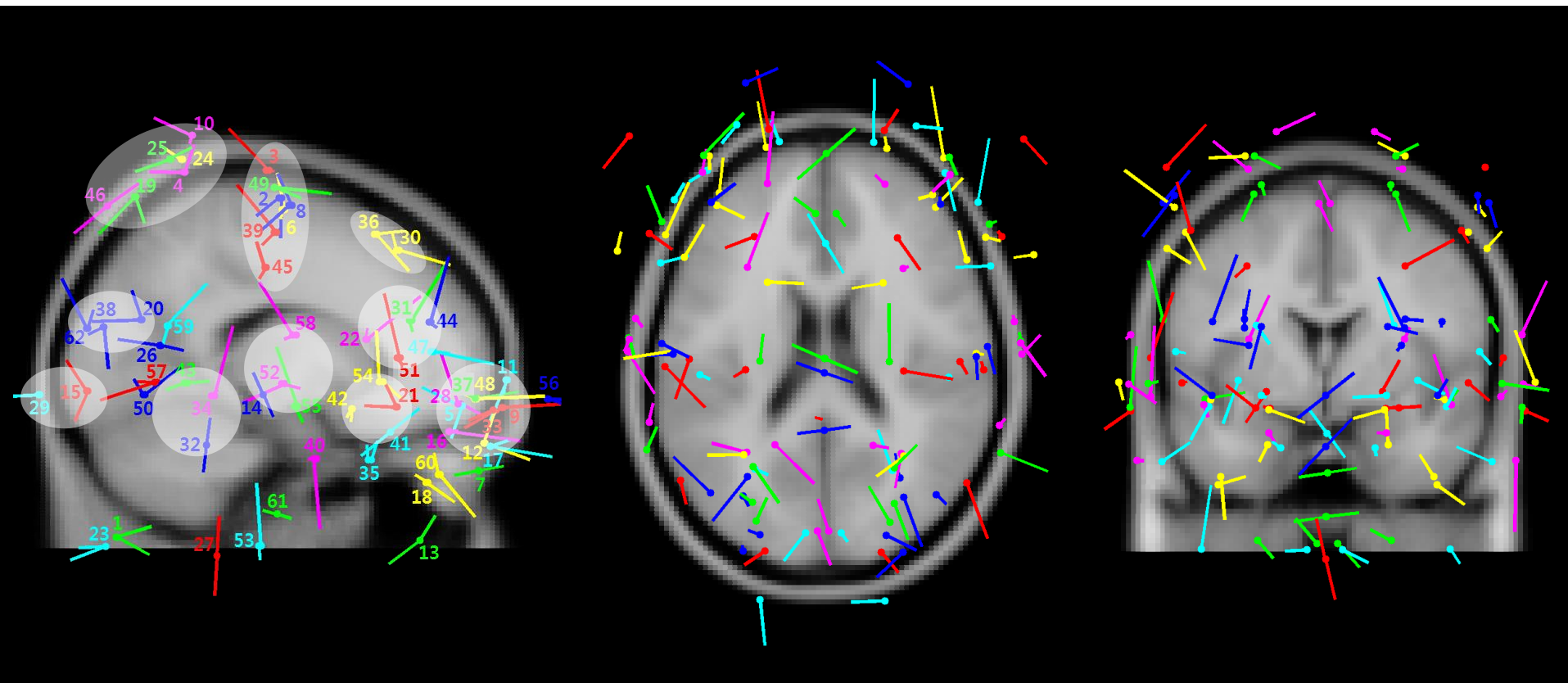
- EEG signals were sampled at 1000 Hz using an EEG cap equipped with 128 electrodes
- Timestamp of all sessions are automatically recorded by the game program



# Methods

## ■ Source Localization

- Fitting dual symmetric equivalent dipole model to each source signal ( $N = 62$ )
- Using DIPFIT2 in EEGLAB with a four-shell spherical head model



# Methods

- **Direct directed transfer function (dDTF)**

- A measure based on the transfer function matrix between channels.
  - Transfer function matrix: an SVD of the cross-spectral density matrix
- A combination of **partial coherence** and **directed transfer function (DTF)**

➤ DTF

$$\gamma_{ij}^2(f) = \frac{|Y_{ij}(f)|^2}{\sum_{n=1}^k |Y_{in}(f)|^2}$$

➤ ffDTF

$$\eta_{ij}^2(f) = \frac{|Y_{ij}(f)|^2}{\sum_f \sum_{n=1}^k |Y_{in}(f)|^2}$$

➤ Power spectrum

$$S(f) = Y(f) V Y^*(f),$$

➤ Partial coherence

$$\chi_{ij}^2(f) = \frac{R_{ij}^2(f)}{R_{ii}(f) R_{jj}(f)},$$

➤ dDTF

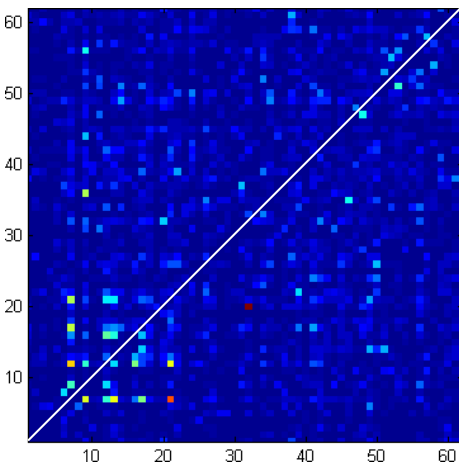
$$\delta_{ij}(f) = \chi_{ij}(f) \eta_{ij}(f)$$

- Time-varying dDTF can be obtained by using **a sliding-window MVAR model**
  - Window length: 500 ms, Step size: 10 ms
  - ➔ **251 windows** (0-500, 10-510, ... , 2500-3000 ms)

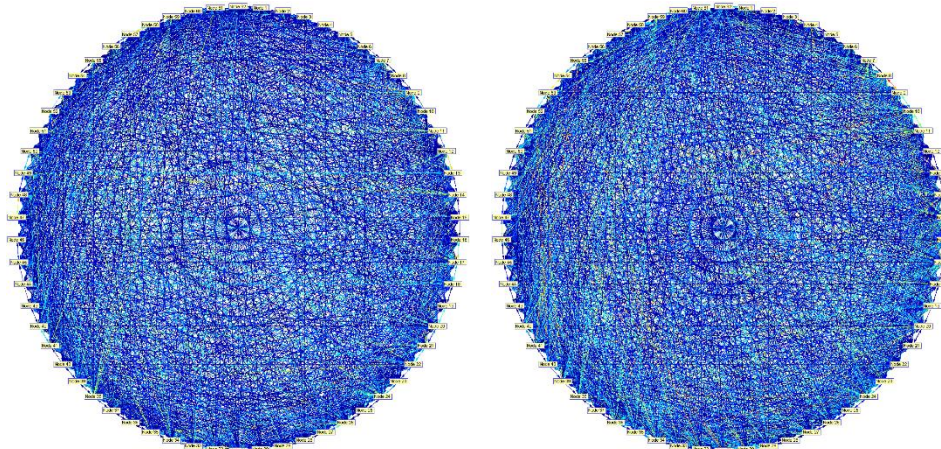


# Experimental Results

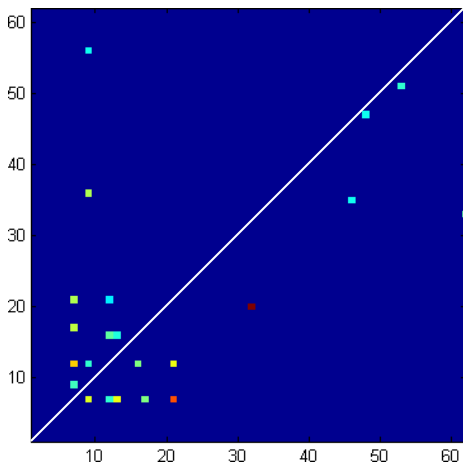
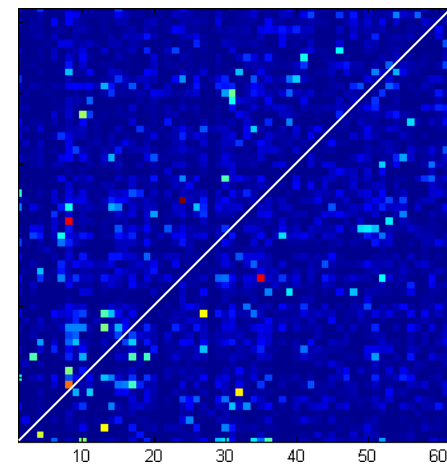
Fixation (threshold =  $1e-05$ )



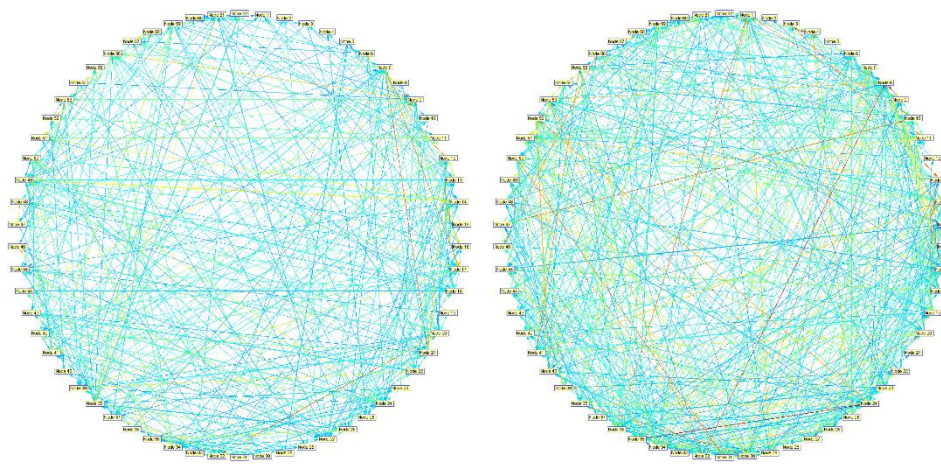
Frequency = 8 Hz; Time = 300 ms



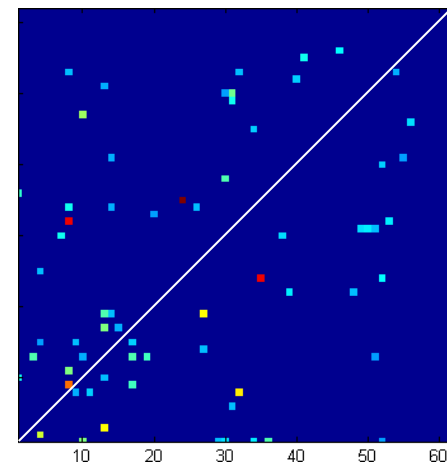
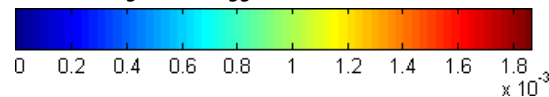
Retrieval (threshold =  $1e-05$ )



Fixation (threshold =  $5e-04$ )



(Color of edges are exaggerated for better visualization)

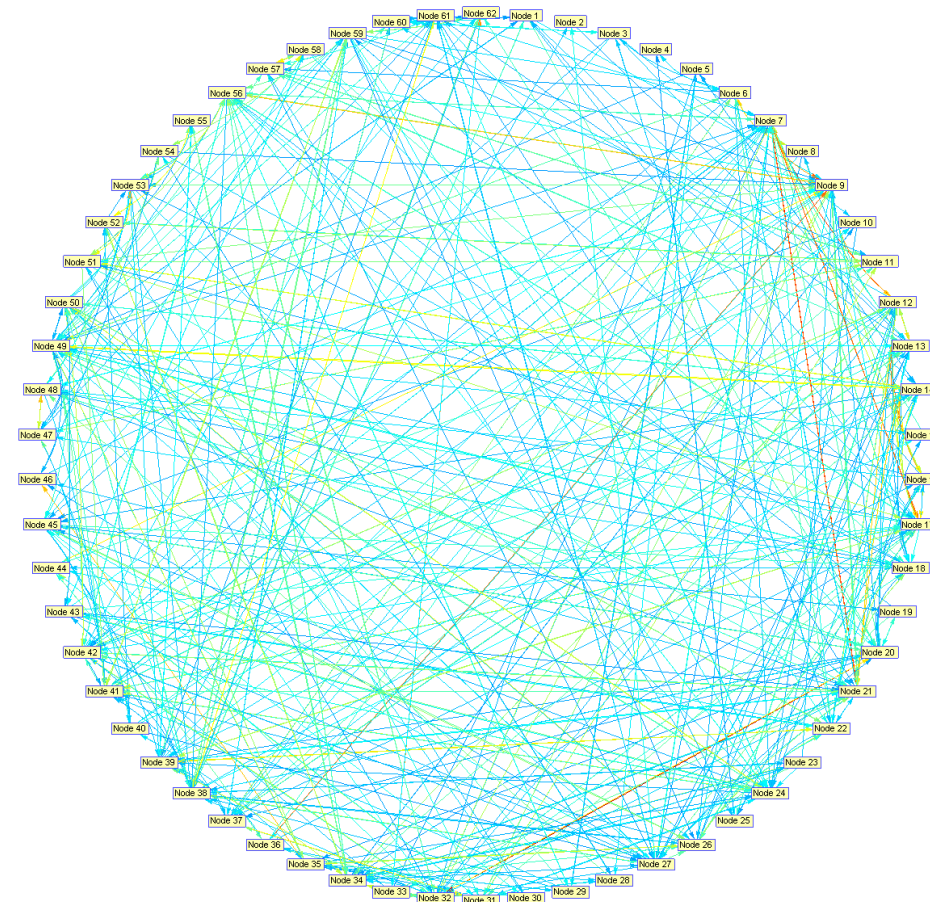


Retrieval (threshold =  $5e-04$ )

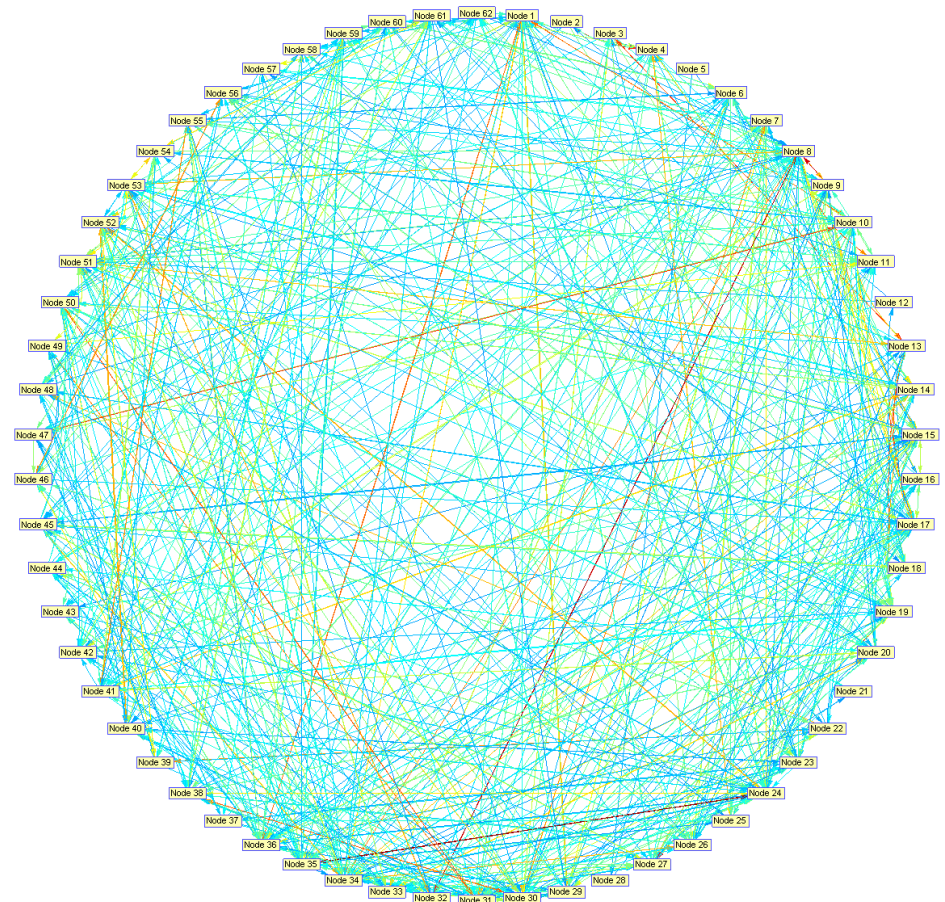


# Experimental Results

## ■ Mean dDTF Network Graph (threshold = $5e-4$ )



Fixation

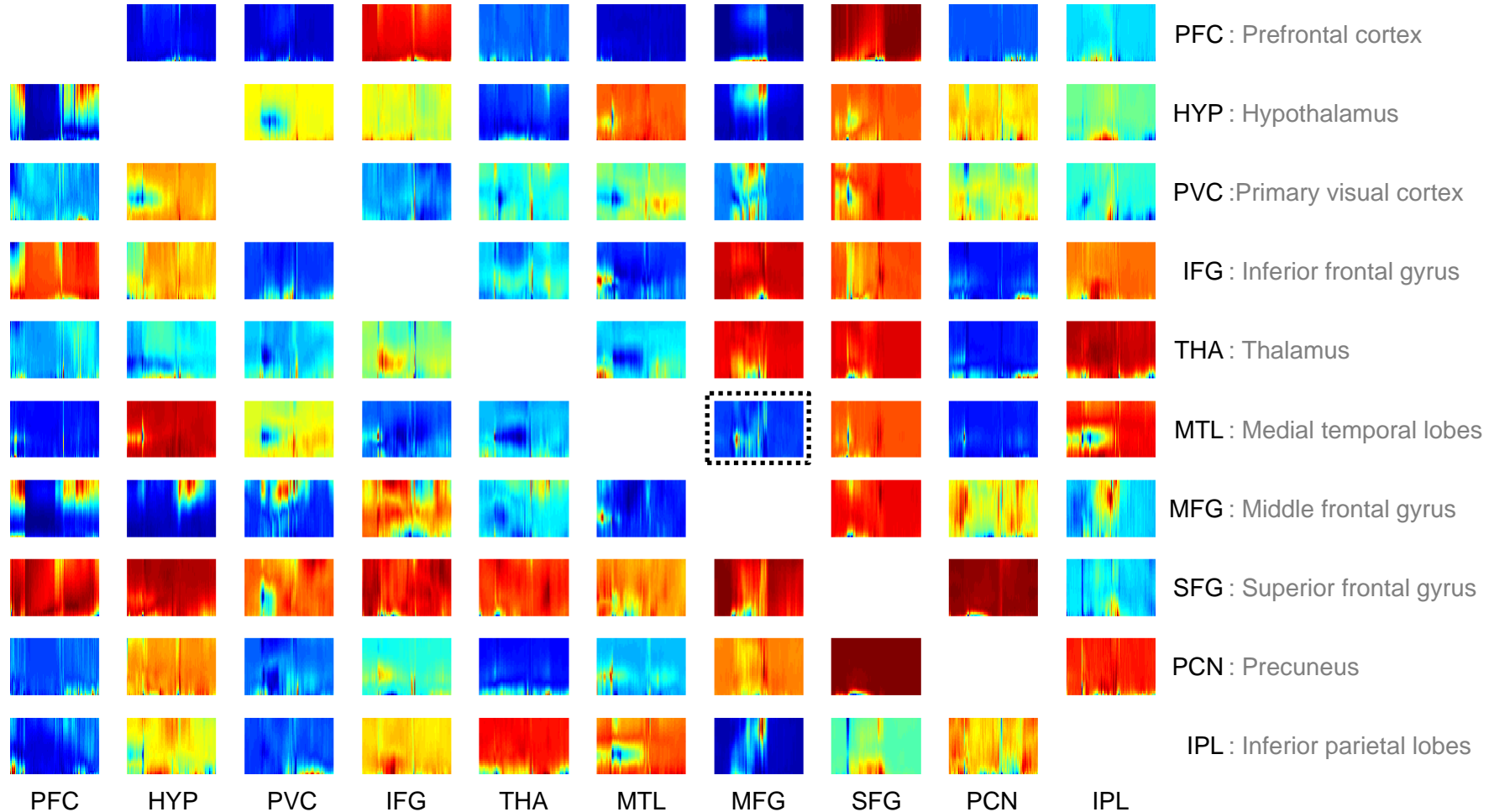


Retrieval

Frequency = 8 Hz; Time = 300 ms

# Experimental Results

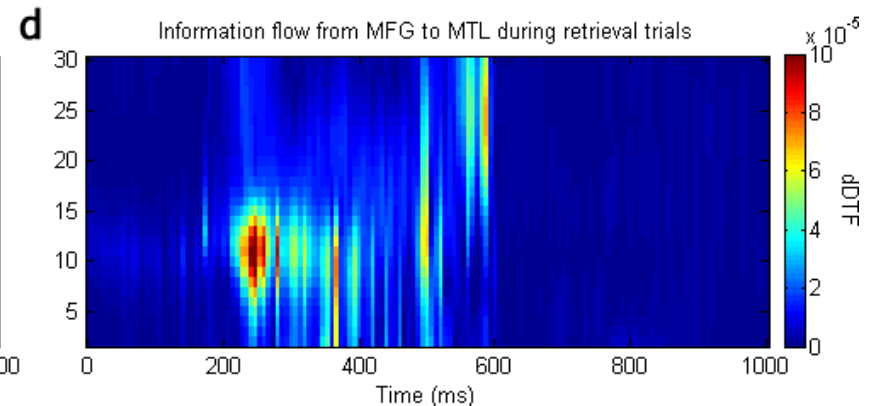
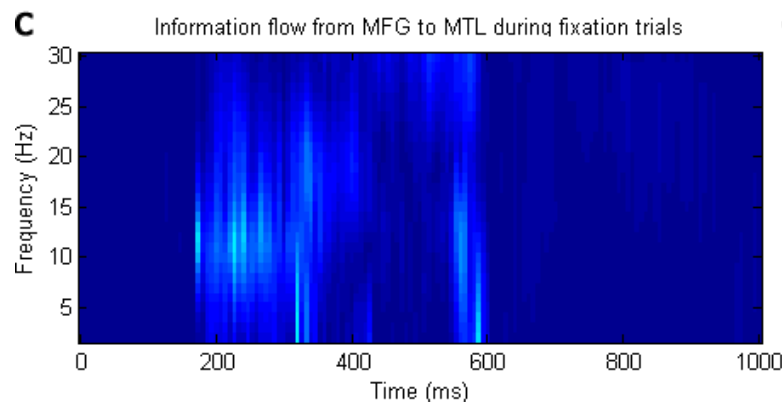
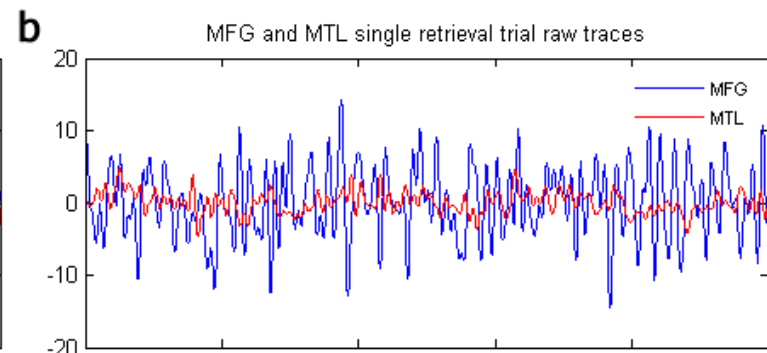
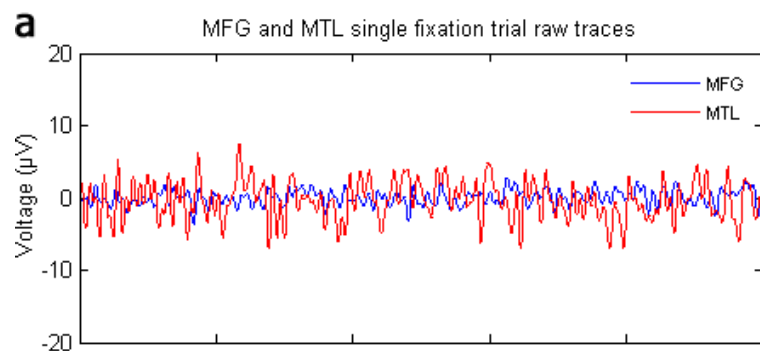
## ■ Active Brain Regions during Retrieval Tasks (Retrieval – Fixation)



# Experimental Results

## ■ Example of the Increased Information Flow

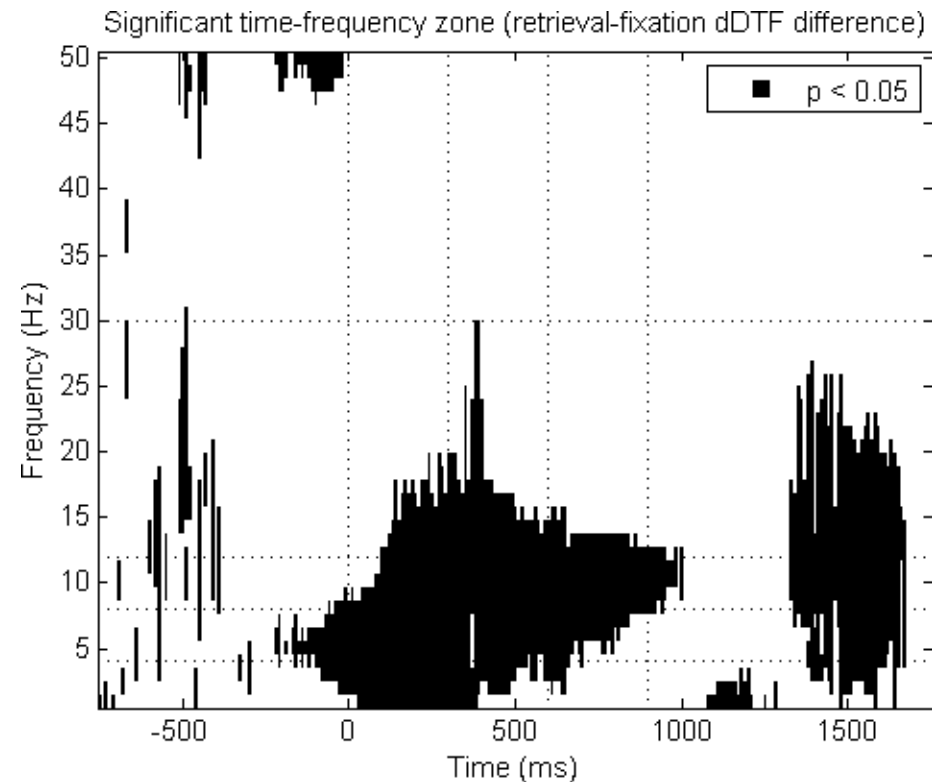
- Information flow from MFG to MTL in retrieval task is higher than in fixation
- Oscillatory powers of MFG in retrieval task is also increased but has no direction
- Which frequency and time bands are significant?



# Experimental Results

## ■ Significant Time-Frequency Zone

- Significantly different dDTF between fixation and retrieval tasks
  - Two-sample  $t$ -test  $\rightarrow p < 0.05$
- Time band: 0 ~ 1000 ms
- Frequency band: 2-30 Hz
- Differences around 1500 ms were not considered
  - Too delayed from the onset of stimuli
  - Irrelative facts

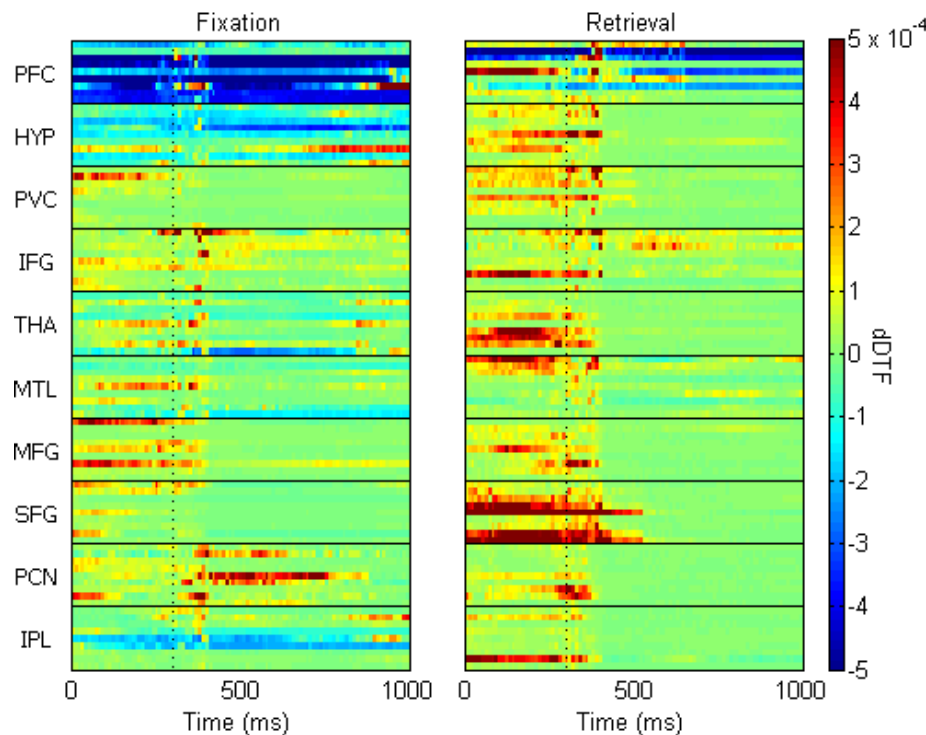


# Experimental Results

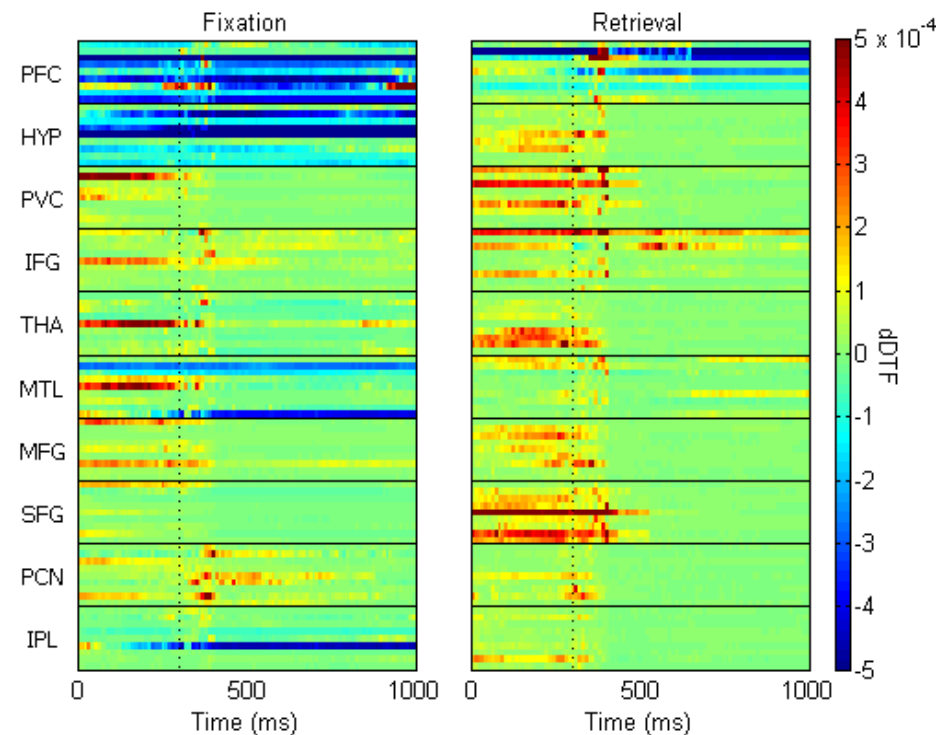
## ■ Information Flows are Increased in Active Brain Regions

- Statistically meaningful increases in most of the 90 pairs during retrieval tasks
- $p_{t-test} < 0.05$  (76 pairs in 4 Hz and 80 pairs in 8 Hz)

**a** Information flow matrices during fixation and retrieval trials (f=4Hz)



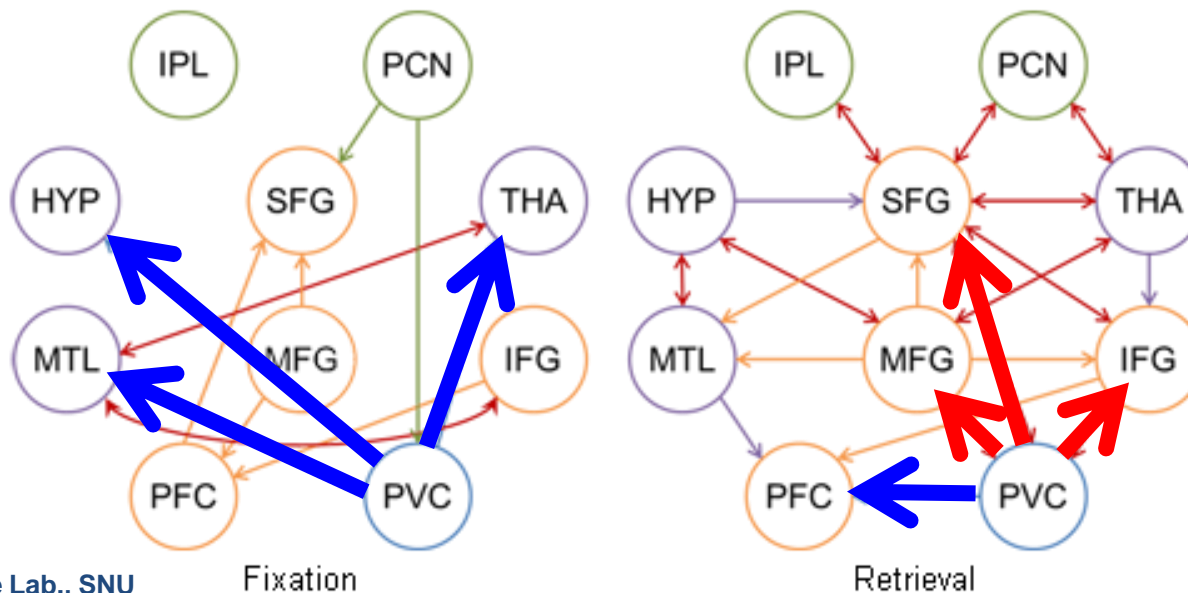
**b** Information flow matrices during fixation and retrieval trials (f=8Hz)





# Experimental Results

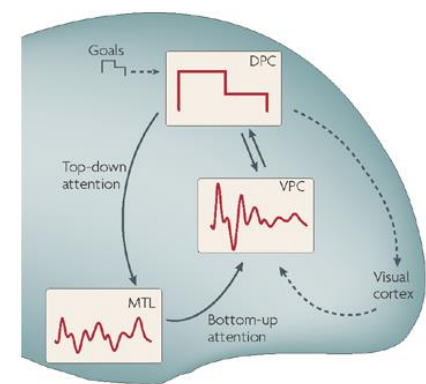
- **Networks of the Effective Connectivity Shows:**
  - Topological interactions across the brain regions
    - **Fixation:** sparse local networks in the frontal and occipital-medial temporal area
    - **Retrieval:** densely interconnected network
  - Asymmetrical features
    - **PVC-temporal/occipital regions** vs **PVC-frontal regions**
    - **PCN→SFG** vs **PCN←SFG**
  - **Hub node:** **SFG** (globally connected with overall brain regions)





# Conclusion & Discussion

- **Information flows during episodic memory retrieval**
  - Between **frontal cortex, medial temporal, parietal and occipital lobes**
  - Globally interconnected effective connectivity network
  - Across 2~30 Hz frequency band and 0~1000 ms time band
- **Graph theoretical analysis**
  - SFG acted as a hub in the network during memory retrieval
  - SFG is a key component of the neural network of memory process
  - **Participation of SFG is triggered by the highest level of executive processing** (Boisgueheneuc et al., 2006)
- **Asymmetric information flows between brain regions**
  - PVC-temporal/occipital regions vs PVC-frontal regions
  - PCN→SFG: non-retrieval; PCN←SFG: retrieval
  - **The dual process model of attention to memory** (Cabeza, 2008)



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**THANK YOU!**