

# **MEG/EEG Network Dynamics in Cognitive Neuroscience**

Gregory V. Simpson, Ph.D.



## Collaborators



### DNL - UC San Francisco

#### Dynamic Neuroimaging Laboratory (DNL)

- Corby Dale
- Darren Weber
- Tracy Luks
- Anthony Kaveh
- Morgan Hough
- Alex Wu
- Brian Shulman
- Tim Rankin

- Steve Bressler (FAU)
- Richard Leahy (USC)
- Felix Darvas (UW)
- Dimitrios Pantazis (MIT)
- Tom Nichols (UMich)
- Gregor Rainer (Max Planck)
- Robert Zatorre (MNI)
- Sylvain Baillet (CNRS Paris)
- Scott Makeig (UCSD)
- John George (LANL)
- Randy McIntosh (Rotman, Toronto)
- Jeremy Caplan (Rotman)
- John Foxe (AECOM)
- Michael Worden (Brown)
- [Keith Worsley (MNI)]

# Overview

## EEG/MEG

Timing information relevant to multiple functional scales:

- Intracortical
- Intercortical
- Sub-second cognitive operations

Spectral Information:

- Functional tags associated with different oscillatory frequencies.
- Cross-Frequency Coupling.
- Oscillatory signals used in measuring connectivity.

Cortical – Cortical Connectivity, Timing and Spectral properties.

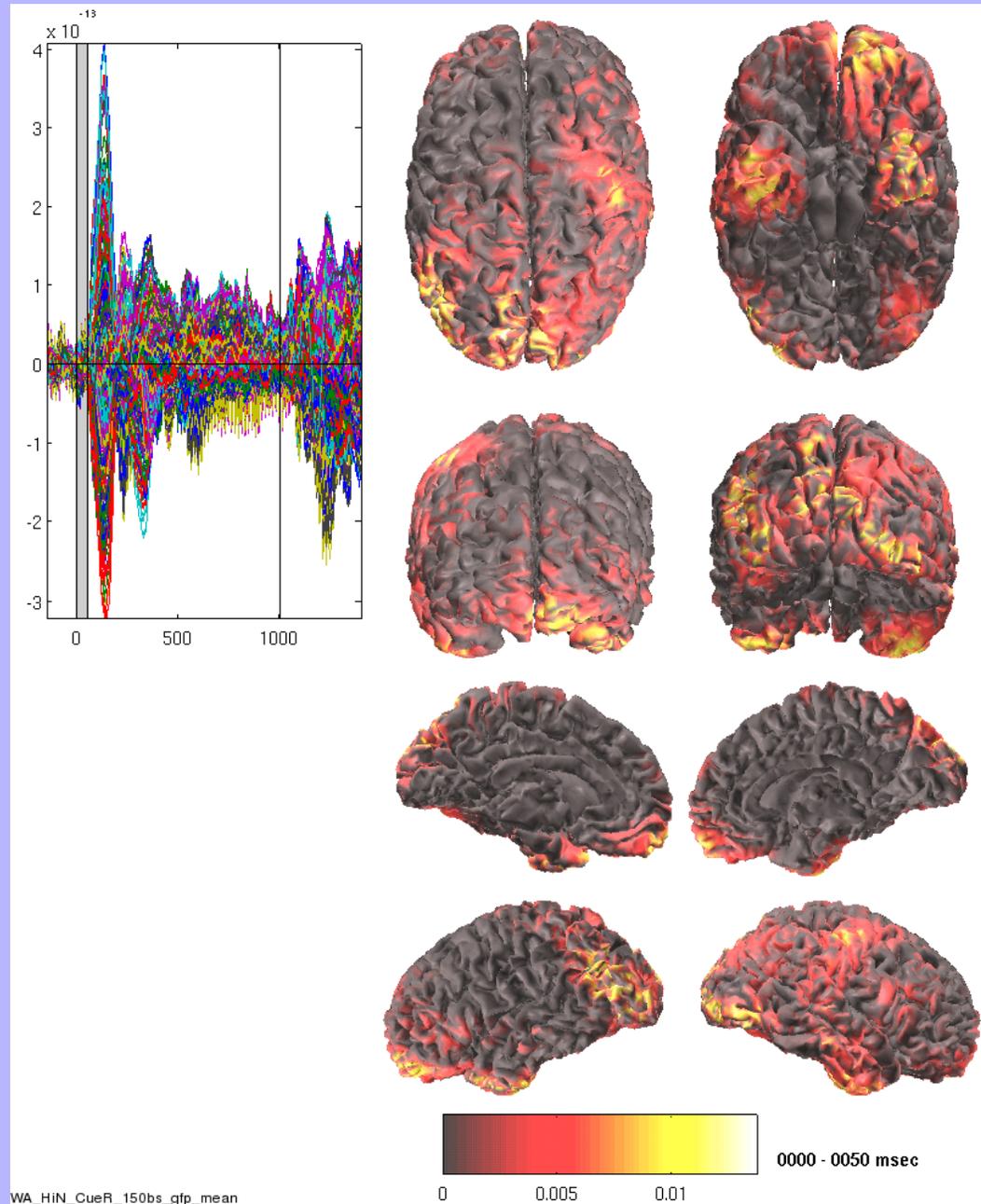
- Timing of interactions between regions in a network.
- Sub-second changes in networks during cognition.
- Long range cortical-cortical interactions and changes in local intracortical synchronization.
- Spectral specificity.

## Large-scale cortical networks as the bases of cognition.

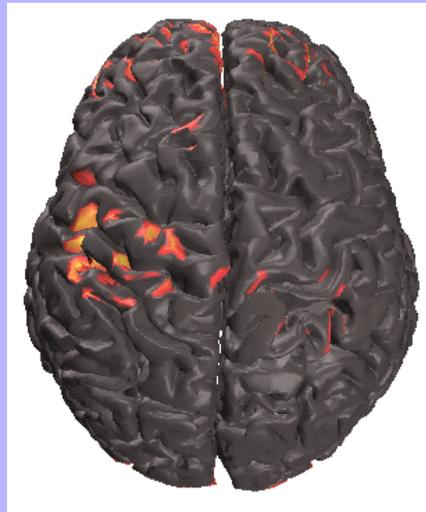
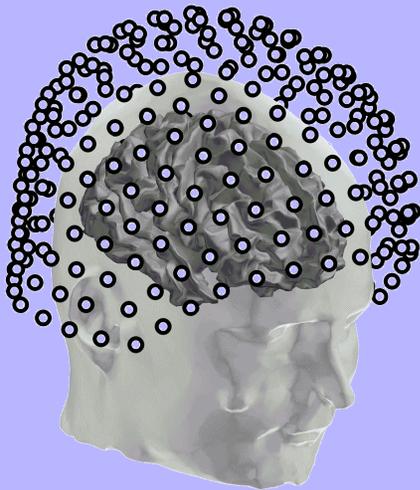
Multiple cortical regions are activated during higher order cognition (frontal, parietal, sensory). The cortical configurations of active systems vary at a sub-second timescale commensurate with the timing of component cognitive operations.

These cortical systems suggest functional networks, and there is growing evidence of interactions between regions to support the notion of functional networks.

These images reflect just one of at least five different electrophysiological signatures of activity. Extremely rich datasets.



# Inverse Problem/Brain Source Imaging



Magnitude  
at every  
time point  
during the  
epoch.

# Brain Source Imaging

**The inverse problem:** information from sensors - solve for location and strength of currents (“sources”) in the cortex that produce the sensor data.

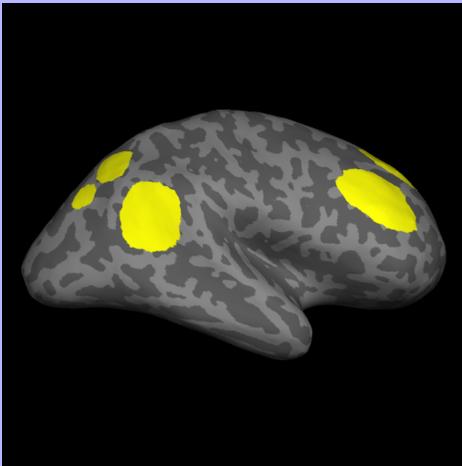
**Categories of methods:**

- Cortically constrained minimum norm provides current at each cortical patch.
- Beamformers.
- ICA approach.
- Spatiotemporal Dipoles (single or few focal sources)

# Spatial Resolution/Accuracy

## Point-spread function:

- PSF varies somewhat for each cortical region.
- can be measured for any region and used to identify magnitude and extent of spread to neighboring regions of interest.



## Differentiating activity in neighboring regions:

Activity in regions that are close together (relative to their point-spread) can still be resolved if there are differences in timing and/or magnitude differences across conditions.

## Assigning activity to a region:

Blurred images limit localization (1-3 cm). Consequently, precise localization of location and extent of activity is limited.

## **Types of signals: Event Related Potentials/Fields (ERP/ERF) & Oscillatory Activity**

### **ERP/ERF:**

Stimulus-locked recording of each stimulus trial and signal averaging across trials. Improves signal to noise, also reduces signals that are stimulus evoked, but not phase locked across trials.

### **Oscillatory Activity (differentiation in the frequency domain):**

Time series, whether stimulus evoked or ongoing, can be decomposed into multiple frequency bands.

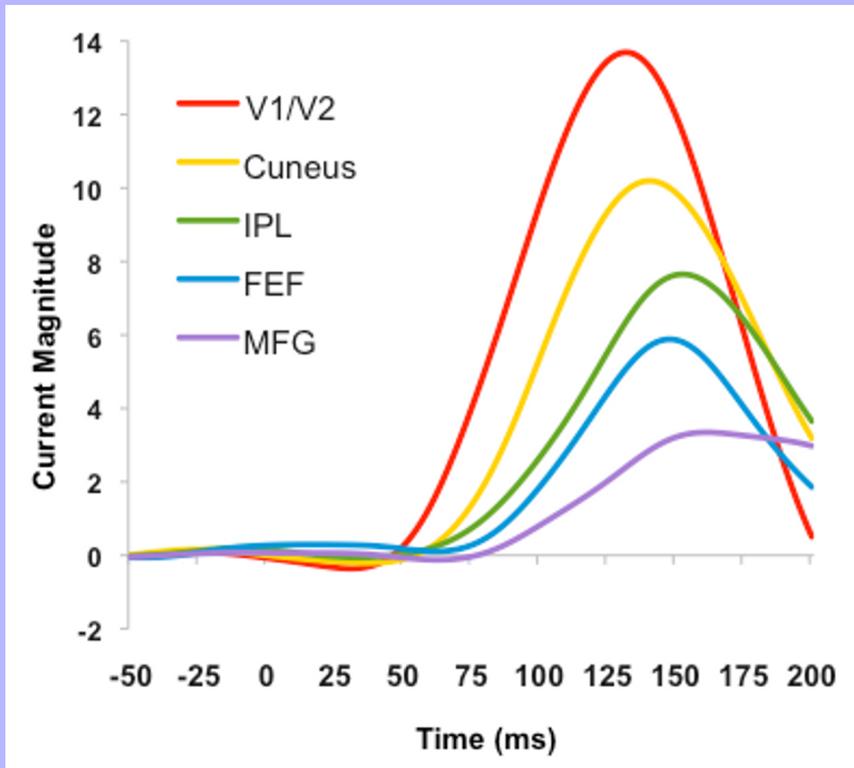
Different frequency bands are being associated with different functional roles.

**Temporal and Spectral:** The timing of magnitude changes in different oscillatory frequencies can be extracted.

# Functional relevance of high temporal resolution

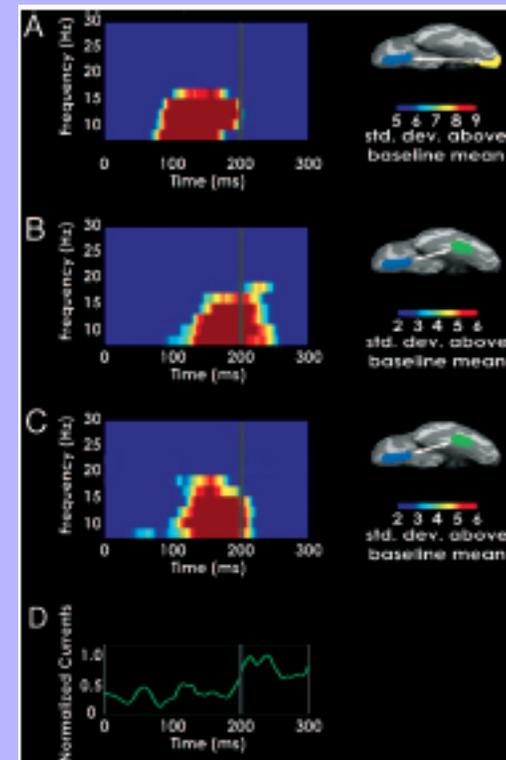
Sufficient to identify sequential flow of activity from one cortical region to another.

Sufficient to measure a cognitive operation in <100 msec. (bottom-up to top-down)



Simpson et., J Neurosci in press

OFC to Fusiform – Successful Object Recog.



Bar et al., PNAS 2006

## **Timing: Network dynamics support functional specificity:**

**Co-Activation of different sets of cortical regions at different sub-second processing stages.**

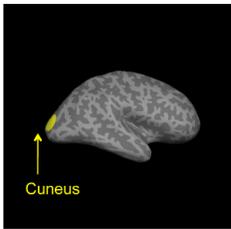
“Network” in the sense of regions that are co-active for a specific cognitive function and a specific processing stage (i.e. without cortical-cortical connectivity measures).

Example: deployment of visual spatial attention

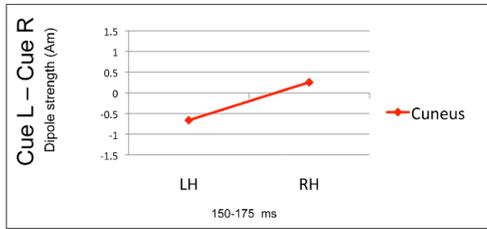
# Anatomically Distinct Cortical Systems Underlie Each Stage of Attentional Deployment

## 150-175 ms Direction Specific Attention System

Direction Specific Cortical System

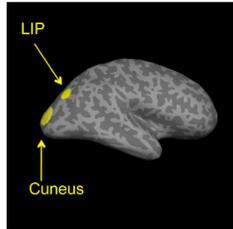


Direction Specific Attention Effect Magnitudes

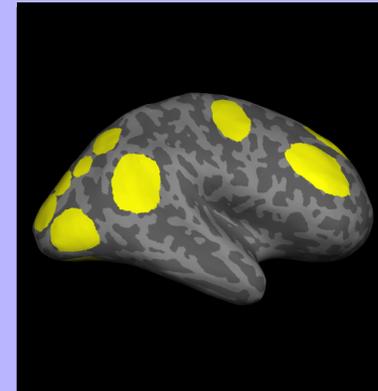
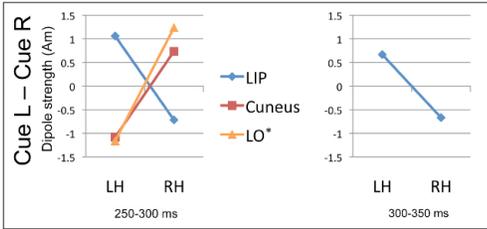


## Early Stage (250-350 ms) - Direction Specific Attention System

Direction Specific Cortical System



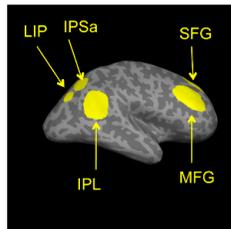
Direction Specific Attention Effect Magnitudes



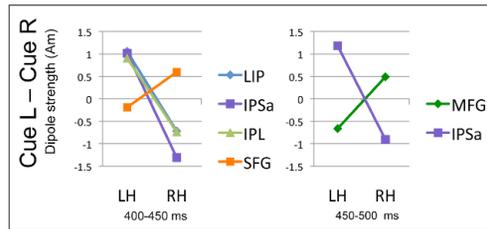
One system or multiple systems?

## Middle Stage (400-500 ms) - Direction Specific Attention System

Direction Specific Cortical System

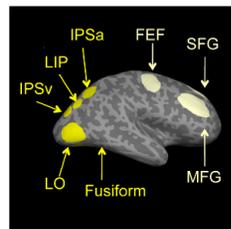


Direction Specific Attention Effect Magnitudes

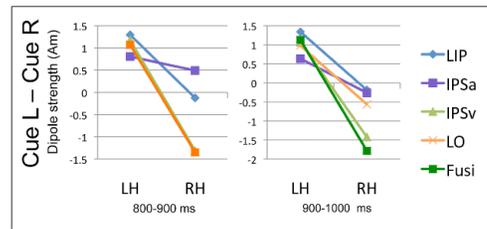


## Late Stage (800-1000 ms) - Direction Specific Attention System

Direction Specific Cortical System



Direction Specific Attention Effect Magnitudes



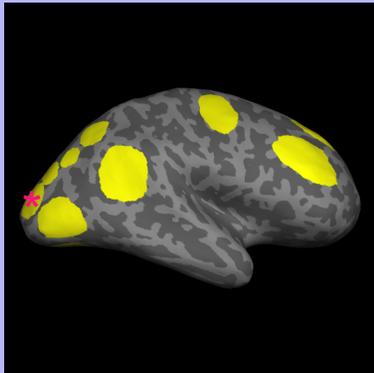
Fundamental organizational concept:

That different cortical networks can form dynamically at sub-second stages of cognitive processes.

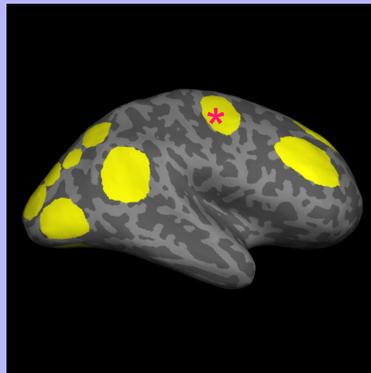
A cortical region can participate in multiple functional roles by working in concert with different cortical systems.

**Temporal Resolution:** At each stage of attentional deployment a different brain region influences subsequent performance.

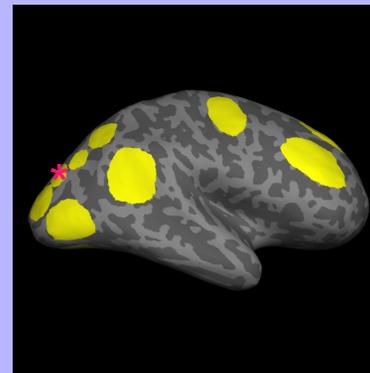
Cuneus (150 ms.)



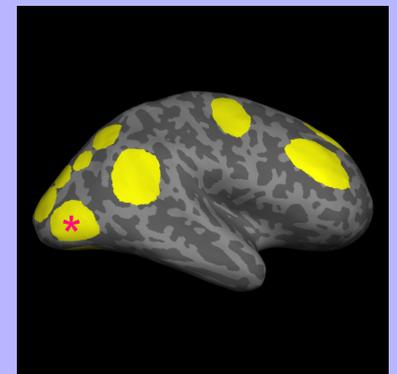
FEF (250 ms)



IPSV (400 ms.)



LO (800 ms.)



Adopted from Simpson et al., 2011

# Oscillatory Brain Activity:

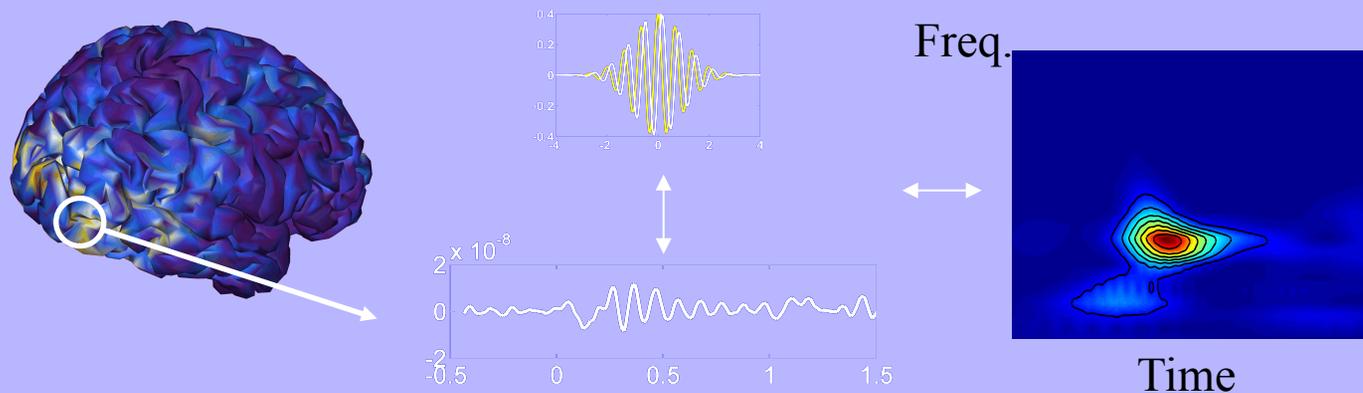
- Synchronization across many neural scales.
  - Neuronal ensembles to intercortical interactions
- Coordination of information and processing.
  - From grouping of unit activity to coordination between distant/functionally related regions.
- Associated with sensorimotor/cognitive function.

# Oscillatory Brain Activity

Several frequency bands may be associated with different functional roles.

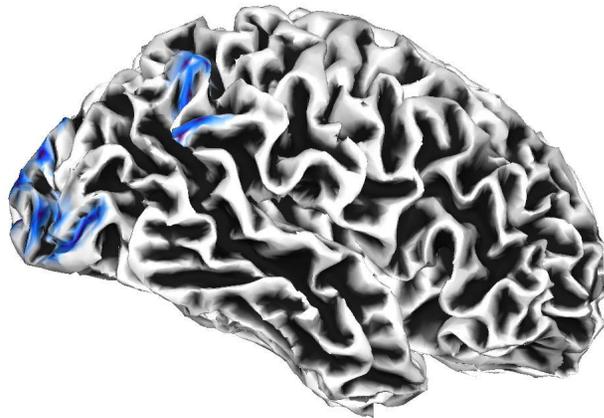
- Theta (4-7 Hz)
- Low Alpha (8-10 Hz); High Alpha (11-14 Hz)
- Low Beta (15-25 Hz); High Beta (25-35 Hz)
- Low Gamma (35-70 Hz) High Gamma (70-120 Hz)

## Complex Morlet Wavelet Expansion

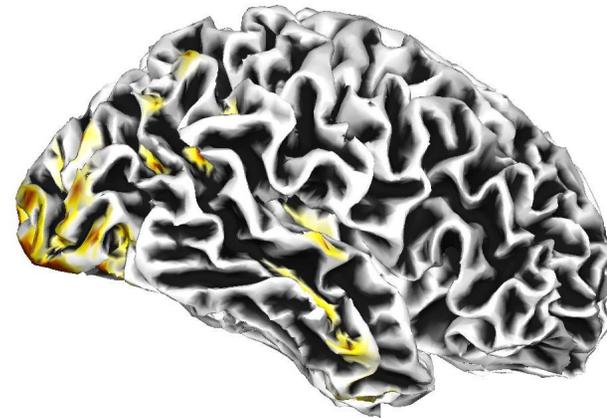


Cognitive operations can involve multiple frequency bands in the same cortical regions.

### Attention specific modulation of visual regions



Alpha (11-14Hz)

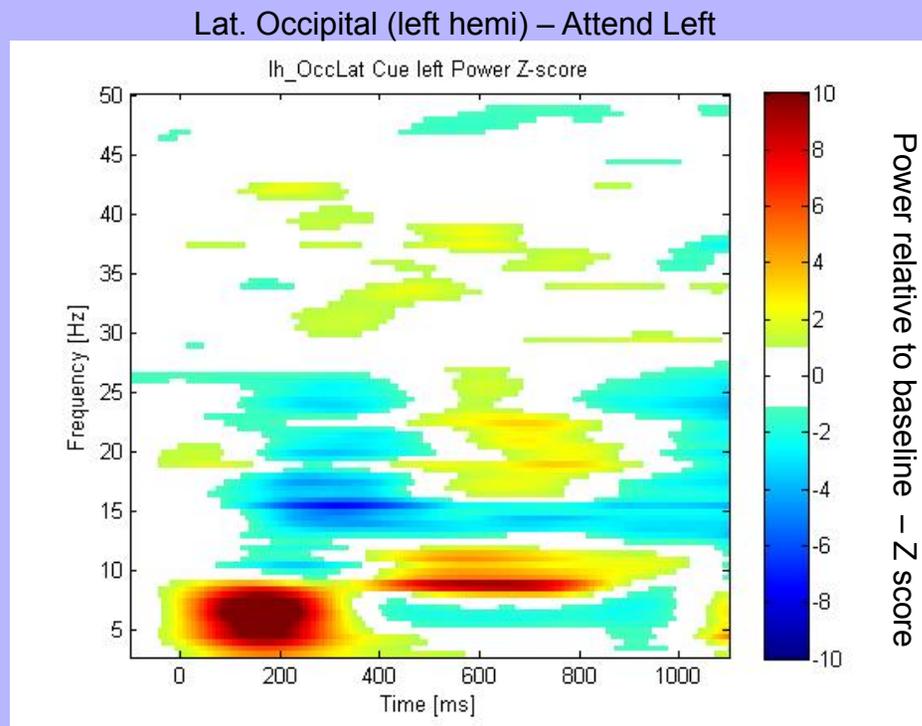


Gamma (30-50Hz)

Attending to the left simultaneously decreases Alpha and increases Gamma in the right hemisphere cortical representations of the attended location.

# Spectral specificity and temporal organization

- Attentional modulation occurs in multiple frequency bands.
- There are distinct temporal windows on a sub-second time scale commensurate with cognitive operations.
- Different frequencies are modulated at different stages of processing.



Attention specific changes in local neuronal synchronization (power) – Lateral Occipital cortex (LO).

# Dynamics support differentiation of functional roles

## Timing of Attentional Modulation of Alpha

### PARIETAL REGIONS

SPL: early transient, shifting.

IPS: early onset and late, diminishing.

TPJ: late onset, diminishing.

### OCCIPITAL REGIONS

All areas: Early onset, sustained, and increasing until S2 arrival.

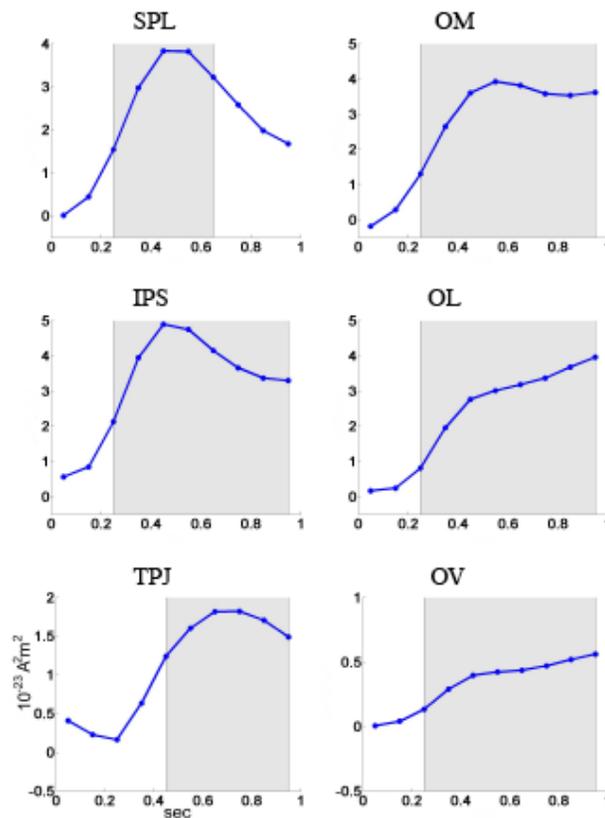
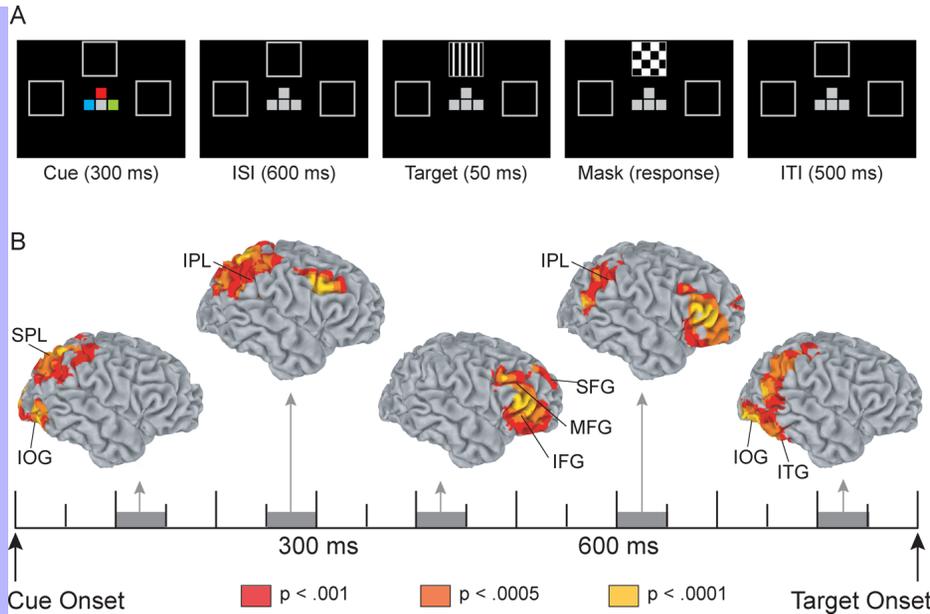
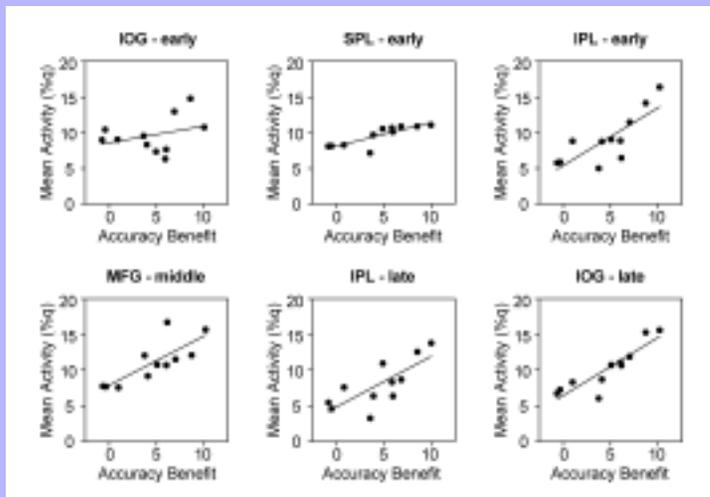


Fig. 11. Temporal dynamics of the ipsilateral vs. contralateral statistic  $S^{STF}$  during 0-1 sec at 6 cortical regions. Shaded areas indicate significance after multiplicity correction using a false discovery rate procedure.



# Timing at the level of cognitive operations

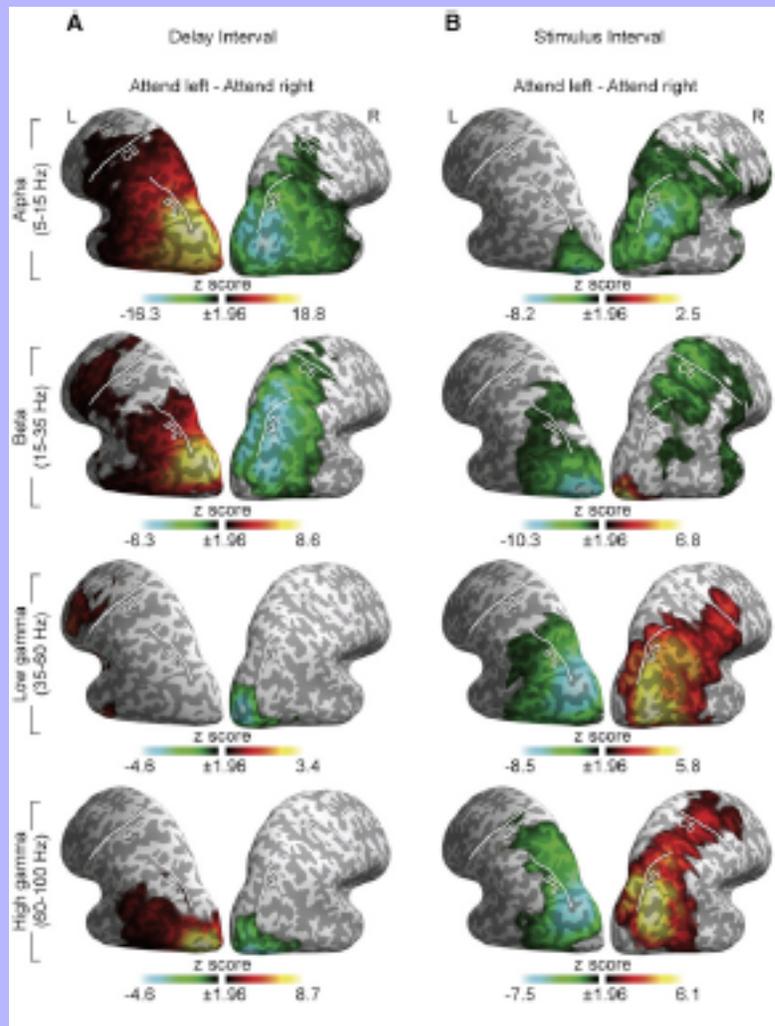
Sequential cortical systems underlying visual attentional modulation of Theta



Magnitude of Theta modulation predicts performance.

Green & McDonald, PLoS 2008

**Cortical Spectral Specificity:** A dimension of functional organization. Different cortical systems are active in different frequency bands and these systems are task dependent.



Different cortical distribution of direction specific attention activity in different frequency bands.

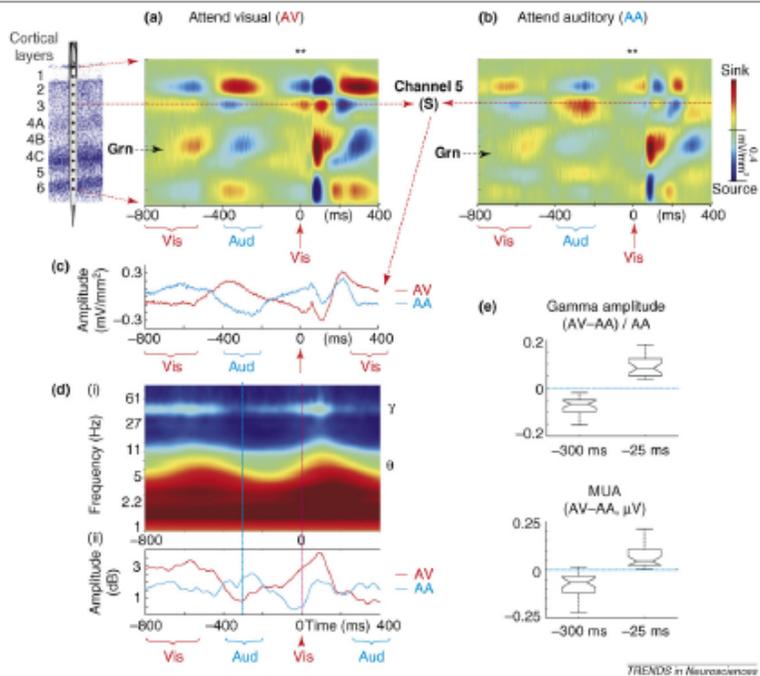
From Siegel et al., Neuron 2008

# Direct Relation to Animal Models

Oscillatory field potentials can be measured together with unit activity in animal cortex to provide a bridge between the human recordings and the detailed neural information provided in animal recordings.

## Interactions of different frequencies as mechanisms of intracortical and intercortical functional organization.

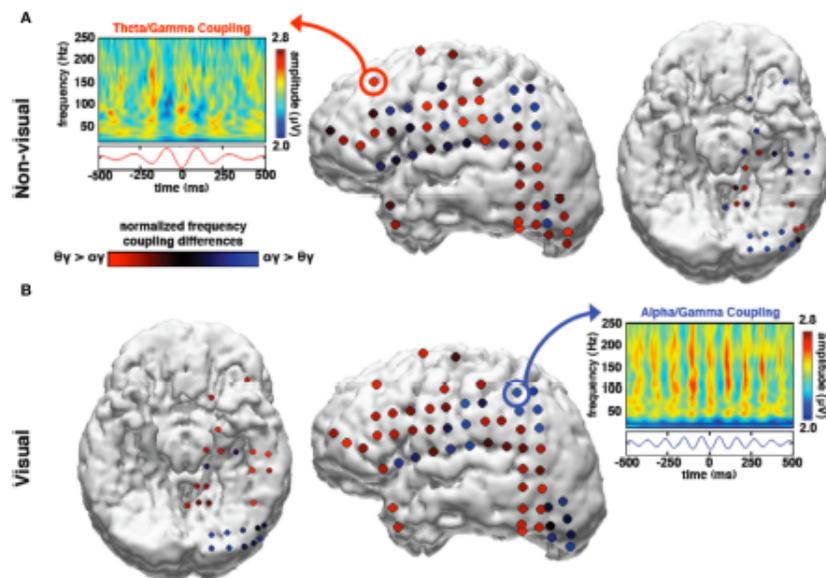
- Cross frequency coupling
- Hierarchy of frequencies
- Entrainment of modulating frequencies
- Dependency on timing of functional operations



Intracortical – multiple frequencies. Support from laminar recordings within cortex (see also e.g. Lee, Simpson et al., Neuron 2005; Gregoriou et al., 2009)

“Hierarchy” – cross frequency coupling; low modulating higher frequencies.

Schroeder & Lakatos, TINS 2008



Intracortical modulation of gamma at two different slower rhythms, Theta and Alpha. Cortical and/or task specificity.

Canolty & Knight, TICS 2010

## Measures of cortical-cortical interactions

- **Coherence:** caveat - increased power in either region can appear as increased coherence.
- **DICS:** useful for identifying regions that are co-active to use as ROIs for follow-up analyses with phase locking or Granger measures. *Gross et., PNAS 2001*
- **Phase Locking:** measure of synchronization between regions that can provide phase difference information that can be converted to latency differences and assessed with respect to expected conduction time between regions - can indirectly support directional influence. *Lachaux et al., 2000*
- **Directional measures**, e.g. Granger Causality, Mutual information: Provide measures in support of a directional influence (e.g. from Region A to Region B). *Brovelli et al., PNAS 2006*
- **Caveat:** “Third-party” (common) inputs. When testing for interaction between Regions A and B, there may be a third or common source of input from Region C.

# Cortical-Cortical interaction measures and point spread issues:

If the two regions being tested for phase locking are so close that activity in one region can contribute substantially to the activity assigned to the other region, then there is the danger of measuring phase locking between the same signal at both locations.

How to assess:

Phase locking values are very large (approaching 1) and not time varying.

Phase Difference is 0 or 180 degree.

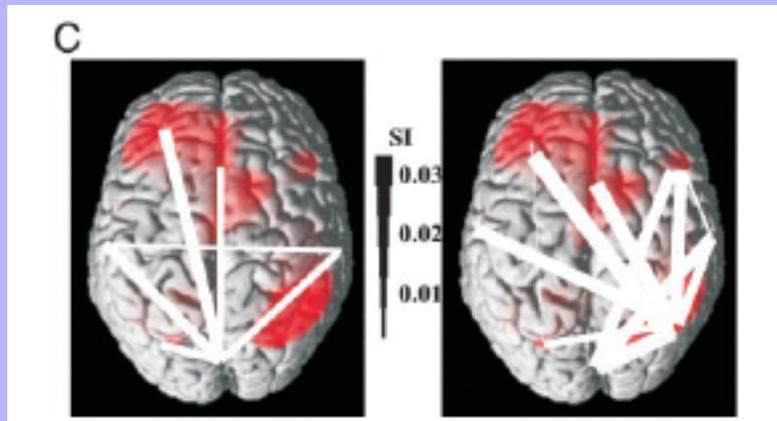
# Principles of Dynamic Brain Network Operation

## Subset of Basic Examples:

- A cortical node (A) can utilize oscillatory activity to interact with another node (B) at a common frequency.
- The interactions between cortical nodes A and B can occur in a uni-directional mode (A-to-B) or bi-directional mode (A-to-B and B-to-A) at different sub-second intervals.
- Cortical nodes can interact in the bi-directional mode by having one direction (A-to-B) coded in one frequency band (e.g. alpha) and the other direction (B-to-A) coded in another frequency (e.g. beta).
- A node can exert a nonlinear modulating influence at one frequency on the oscillatory activity at another node occurring at another frequency. For example: the level of gamma activity in area B can be modulated over time at a theta frequency by area A.
- Oscillatory activity at one frequency at node A can be nonlinearly coupled to oscillatory activity at another frequency at node B.
- A cortical node can interact with multiple other cortical nodes at the same time to form a distributed functional network.
- A cortical node can actively participate in more than one functional network at the same time, by virtue of the oscillatory frequencies it operates in. For example: node A can interact with nodes B, C, and D at one frequency (e.g. alpha), and also with nodes G, H and I at another frequency (e.g. theta).
- Functional networks can change in a fraction of a second. Coupled with the above principles this enables models with both parallel and rapid serial processes over the course of cognitive processing.

# Specificity of Cortical Networks for Cognitive Processes

## Attentional Blink Task

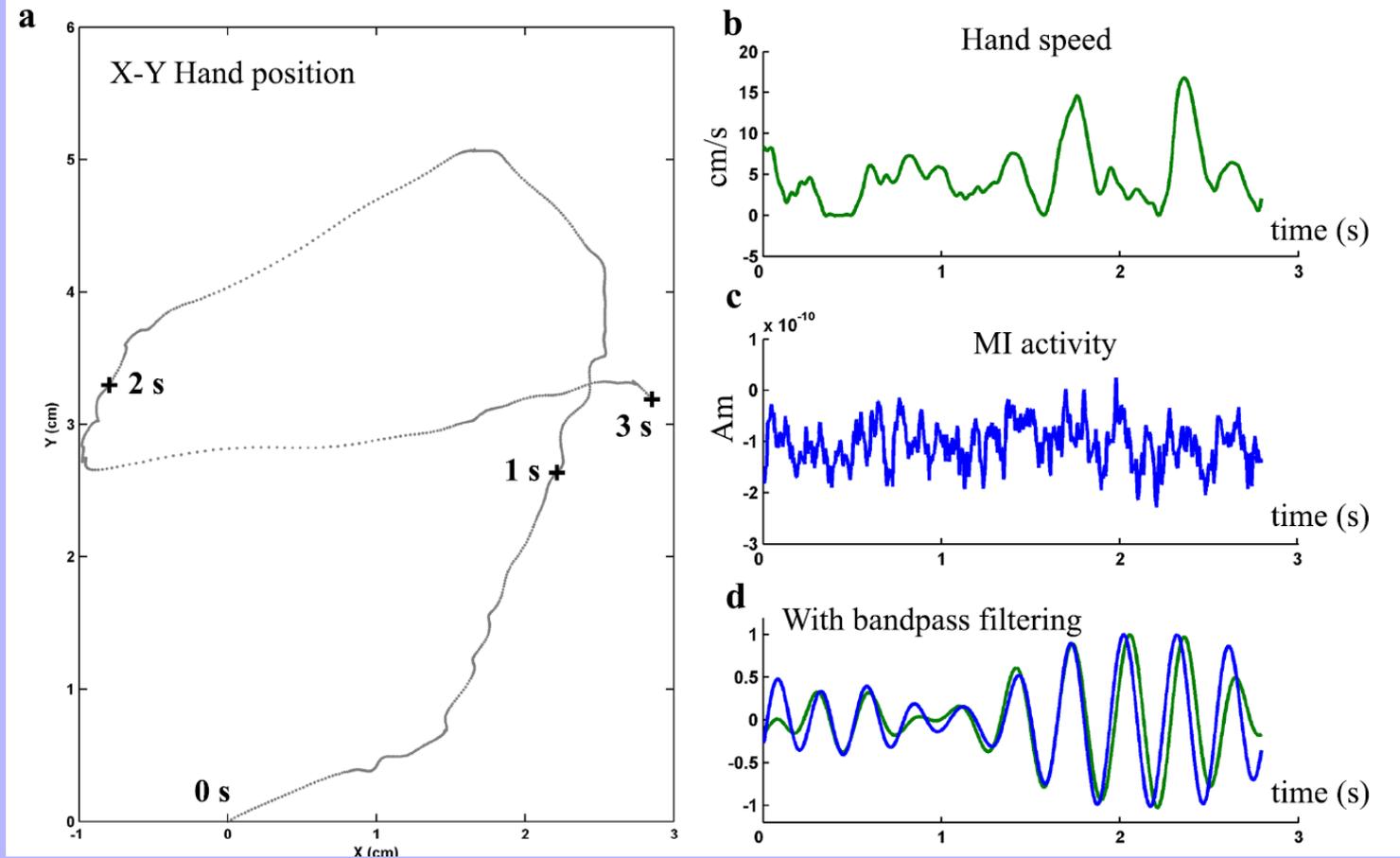
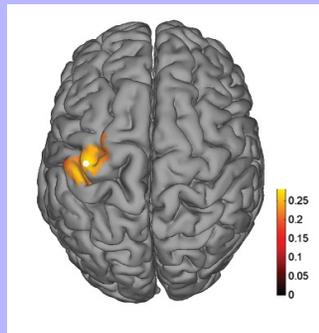


Stimulus  
Network

Target  
Network

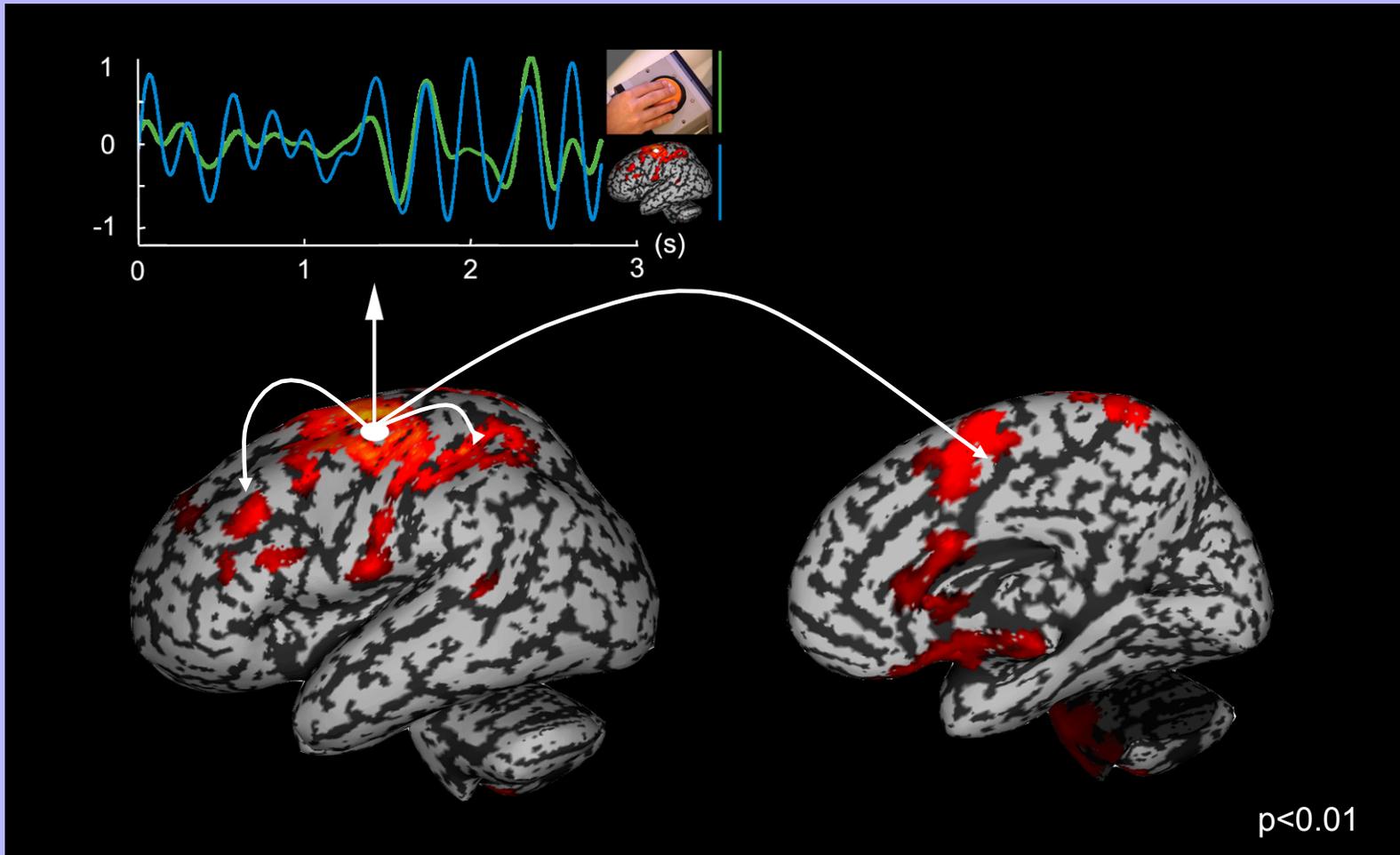
Strength of synchronization between regions; Gross et al., PNAS 2004

# Brain activity coherent with hand speed



(Jerbi et al., PNAS, 2007)

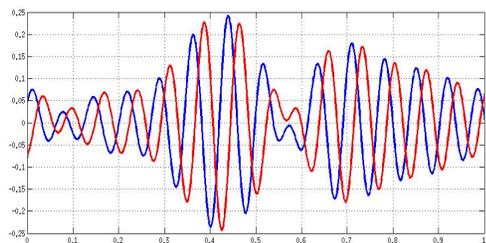
# Network in coherence with activity in primary motor cortex



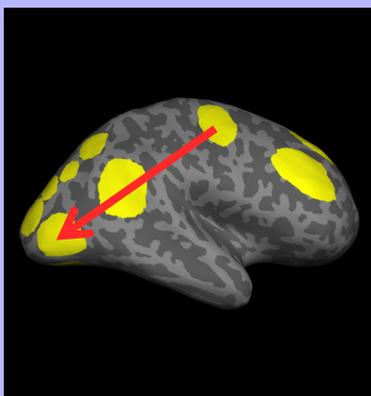
(Jerbi et al., PNAS, 2007)

Note: medial PFC – interplay self-action/change in external visual

## Inferred direction with Phase Delay.



- Translate the the phase delay for a specific frequency into time (msec):
  - Area **A** precedes Area **B** by X msec.
- Is X consistent with the physiological conduction time from **A** to **B**?
- If so, then this can provide indirect support for direction.
- If there are additional frequencies that show phase locking, and the delays for these are also consistent with **A** precedes **B** by X msec., then this adds support.



### FCx top-down interaction with VCx.

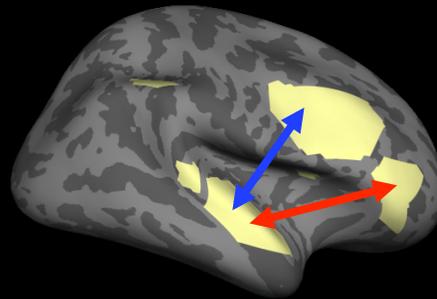
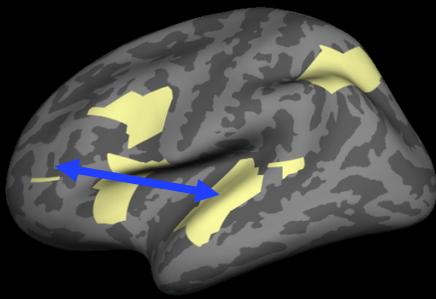
- Increased phase-locking in Theta (4 Hz) between FCx and VCx.
- Phase delay = 36 degrees → 25 msec.
- Support for communication from FCx to VCx.

See Gregoriou et al., Science 2009; primate FEF-V4

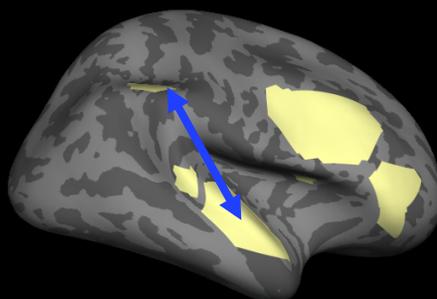
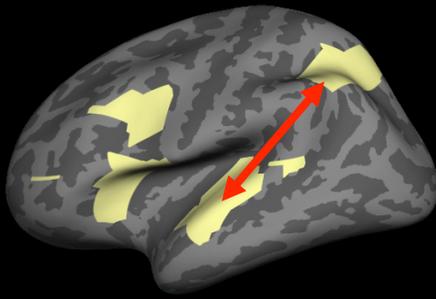
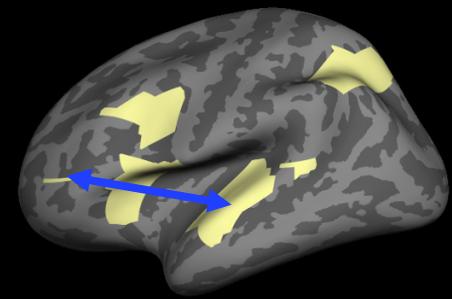
# Network Specificity: Task, Accuracy and RT

Accuracy

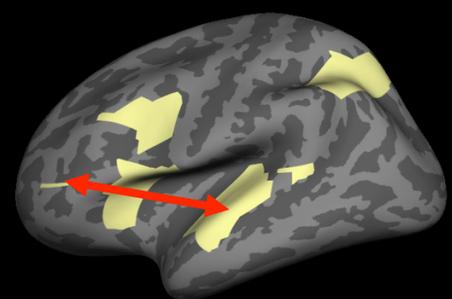
Reaction Time



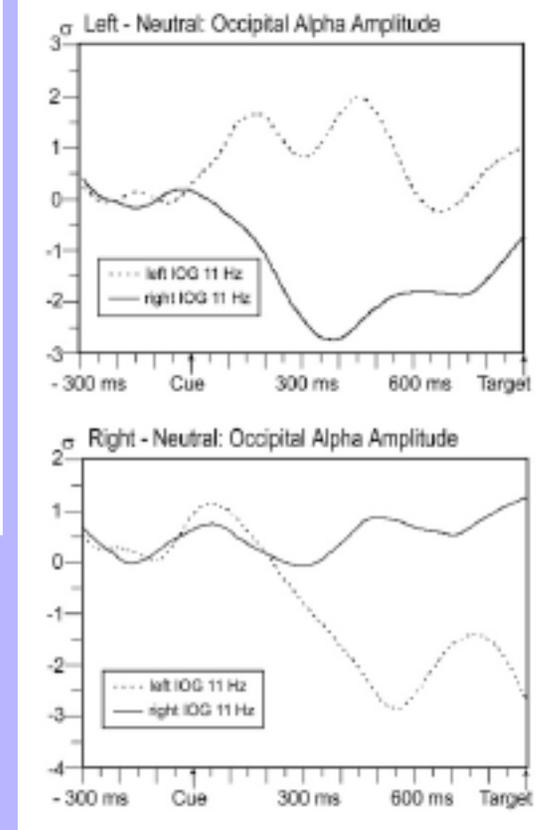
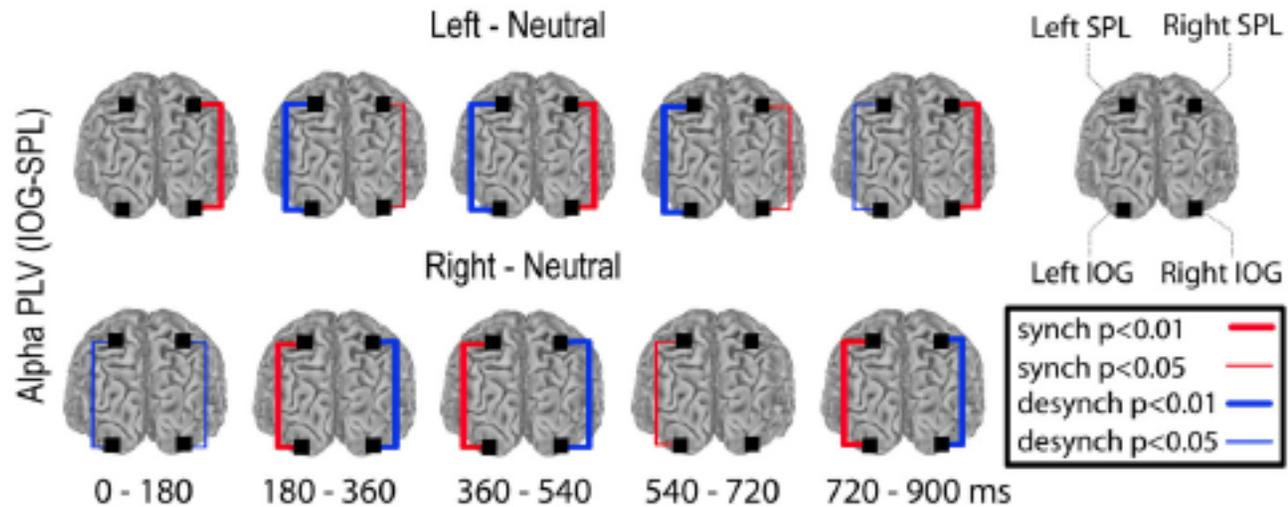
Word



Tonal Pattern



# Intra and Inter-Cortical synchronizations in the same frequency

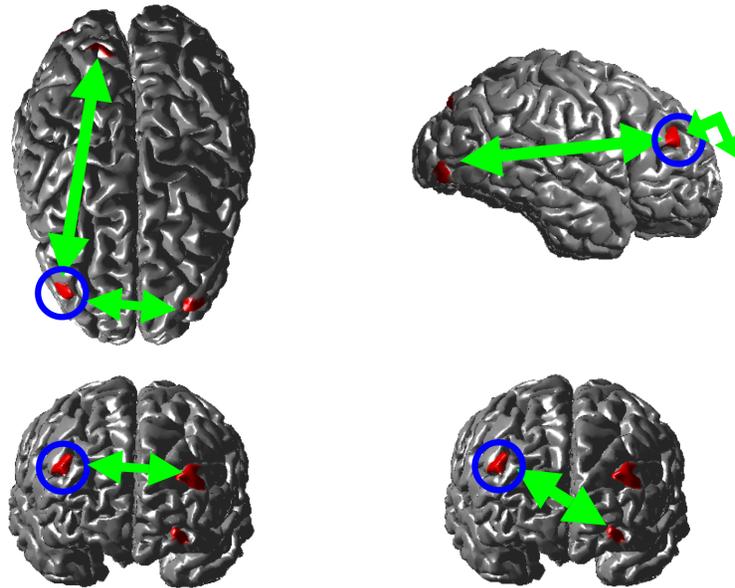


Decreased intra-cortical synchronization with increased intercortical synchronization in alpha band.

A cortical region can participate in multiple, functionally distinct networks at the same time by interacting in different oscillatory frequencies.

### Cortical “Multi-Networking”

Right Dorsolateral Prefrontal Cortex (blue circle) forms two functionally distinct cortical networks at the same time by synchronizing activity with other cortical regions in two different frequency bands during a visual attention task.



Alpha Network

Parietal and Dorsolateral Prefrontal

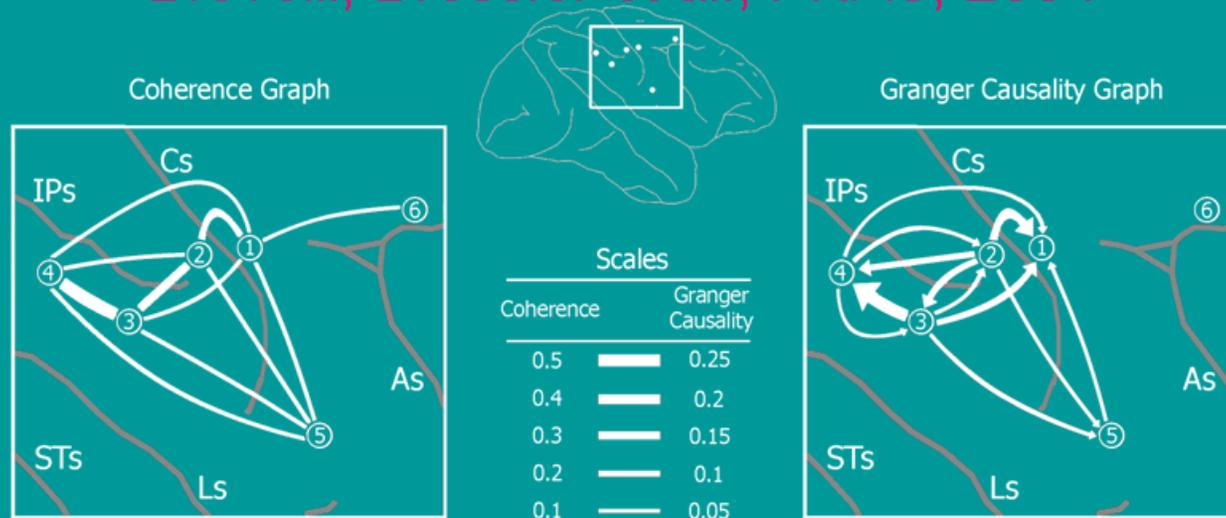
Theta Network

Occipital and Ventral Prefrontal

# Granger Causality: analysis of electrophysiological data

## Sensorimotor Network in Motor Control

Brovelli, Bressler et al., PNAS, 2004

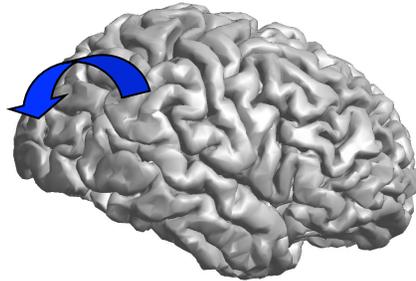


Synchronized beta oscillations bind multiple sensorimotor areas into a large-scale network during sustained motor output.

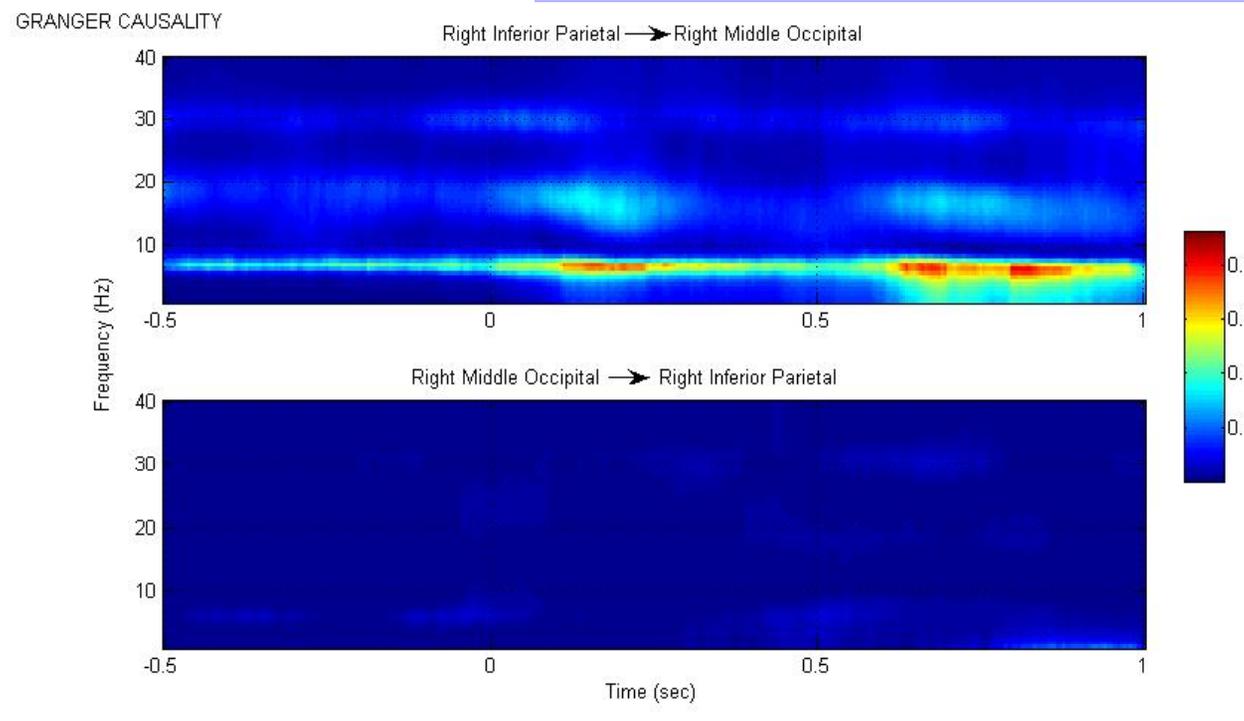
*Bressler Cognitive Neurodynamics Laboratory  
Center for Complex Systems & Brain Sciences  
Florida Atlantic University*

# Functional Connectivity

## Granger Causality: Uni-Directional Cortical Interaction

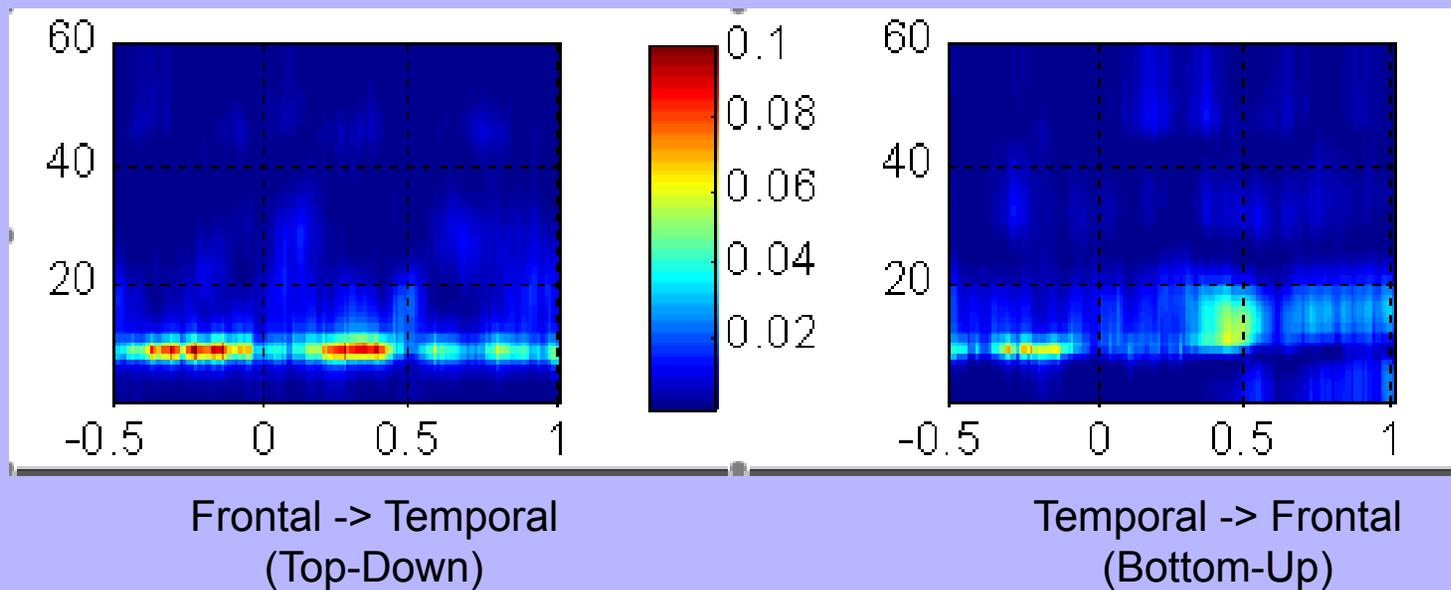
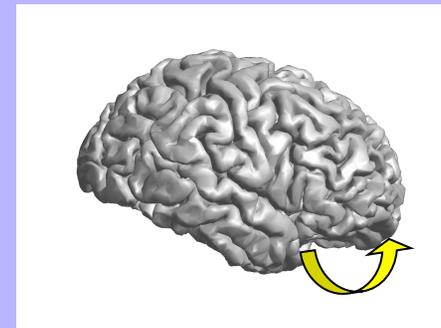
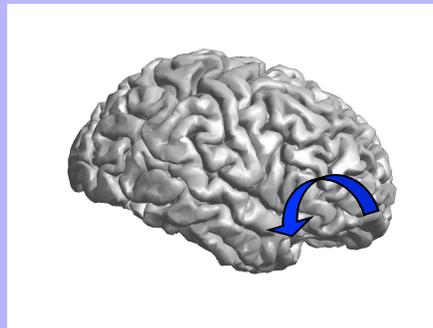
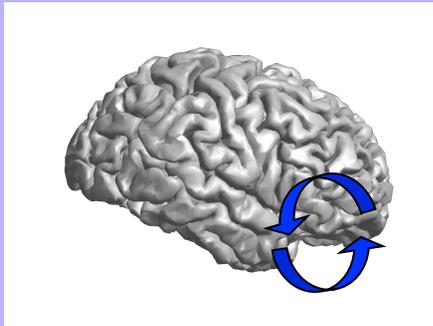


Top-Down Control  
Without Bottom-Up Counterpart  
Parietal to Occipital (Alpha).



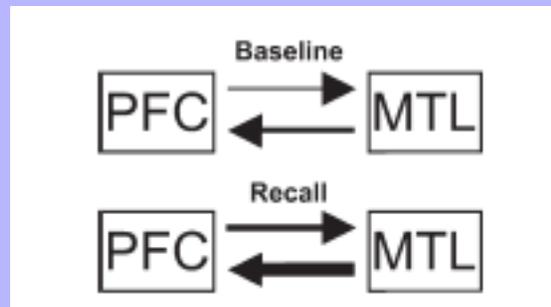
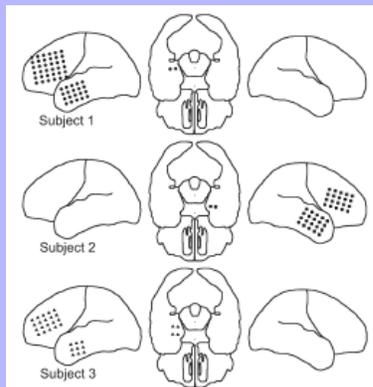
# Functional Interactions

Granger Causality combined with spectral and temporal specificity  
differentiate multiple types of interactions



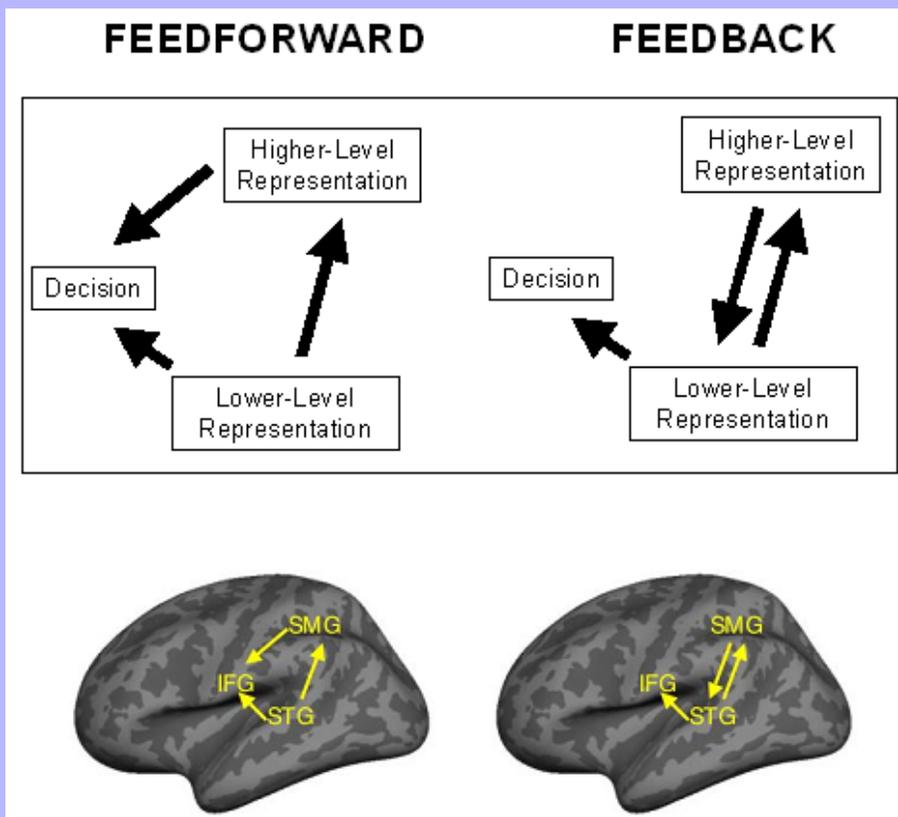
Identifying nature of cortical interactions underlying memory retrieval (free recall task).

Granger analyses applied to Theta activity



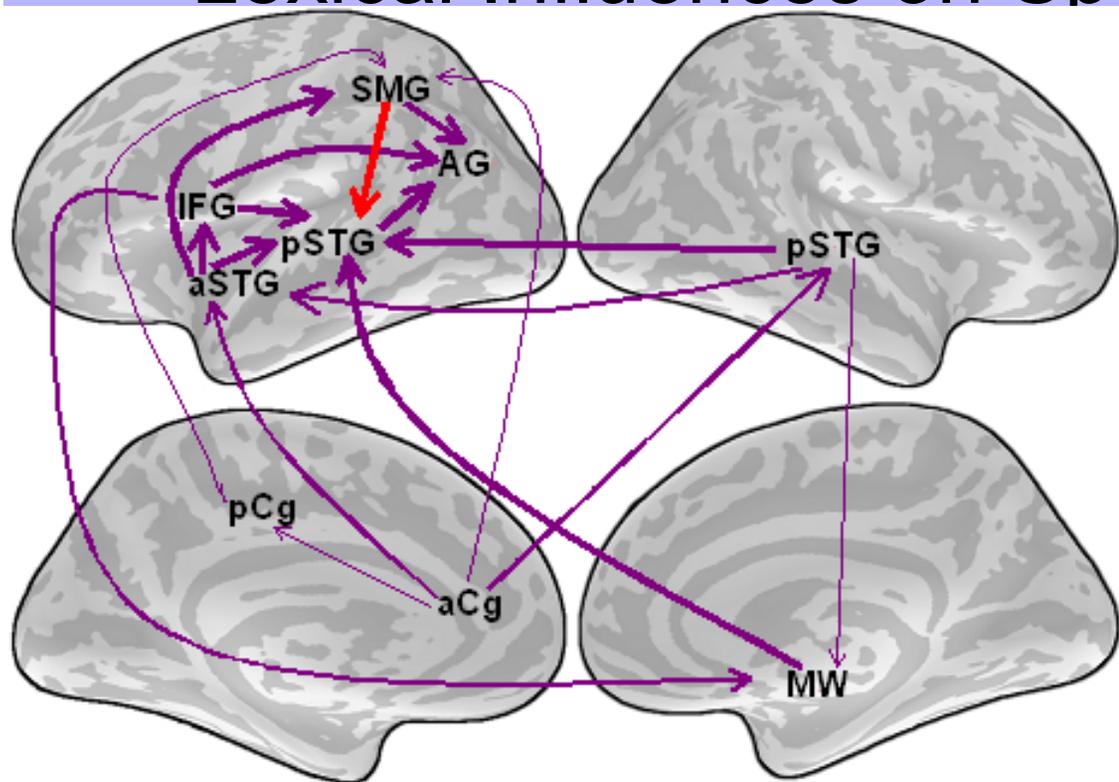
Andersen et al., Cerebral Cortex 2010

# Neural Causation: Lexical Influences on Speech Perception



- Ganong effect: perception of ambiguous speech sounds affected by context
  - *shandal* – *sandal*
  - *shampoo* – *sampoo*
- Interaction of lexical and phonetic processes:
  - Top-down (feedback) model
  - vs.
  - Feedforward model

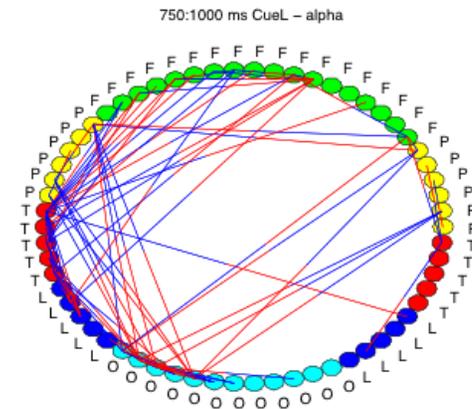
# Neural Causation: Lexical Influences on Speech Perception



- ROIs:
  - phase synchrony with left pSTG in 40 Hz gamma band at 280-480 ms
- Granger causality:
  - top-down lexical influence (left SMG) on phonetic processing (left pSTG)

# Granger Causality

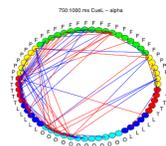
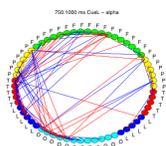
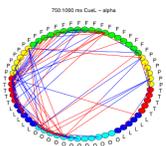
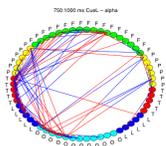
- One frequency band.
- One time window.
- Multiple Brain Regions Interact
- Top-Down
- Bottom-Up
- Bi-Directional
- Divergence
- Convergence
- Strength not indicated



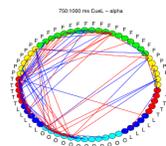
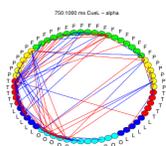
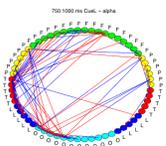
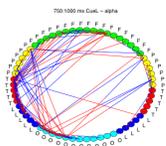
# Dynamic Network Complexity

Frequency

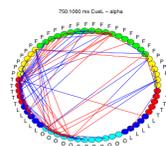
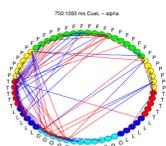
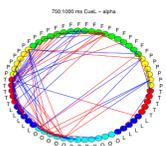
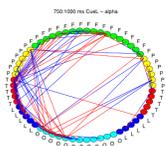
Theta



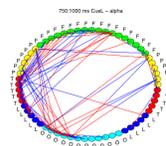
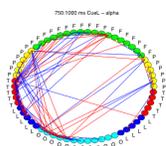
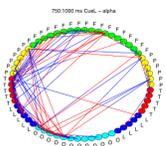
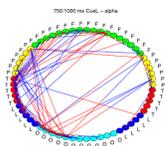
Alpha



Beta



Gamma



Time Windows