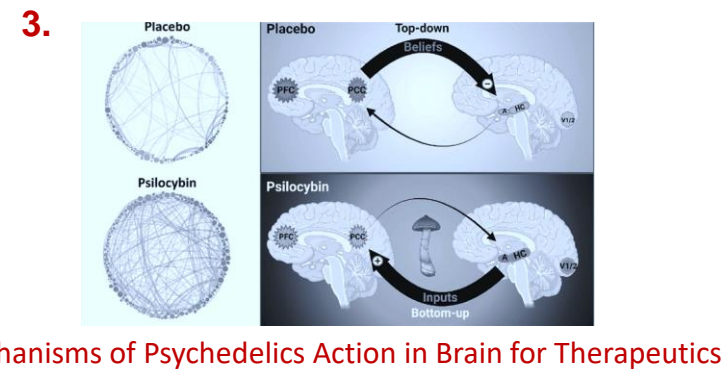
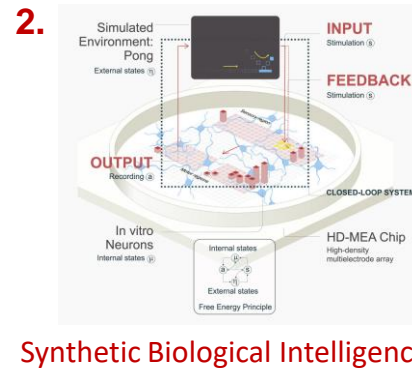
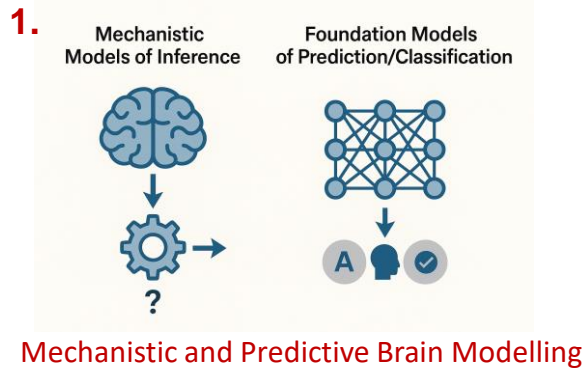


Computational Neuroscience Laboratory



Prof Adeel Razi
Lab Head



Winnie Lau
Senior Research Fellow
Clinical Psychologist



Leonardo Novelli
Research Fellow
Applied Mathematician



Devon Stoliker
Research Fellow
Psychology



Moein Khajehnejad
Research Fellow
Machine Learning



Mehran Bazargani
Research Fellow
Computer Science



Hannah Hawkes
Senior Psychotherapist
Clinical Psychology



William Woodrow
PhD Student
Clinical Neuropsych



James Walker
PhD Student
Machine Learning



Sarah Wallis
PhD Student
Clinical Neuropsych



Tamrin Barta
PhD Student
Clinical Neuropsych



Matthew Greaves
PhD Student
Psychology



Zhenzhen Yang
PhD Student
Information Engineering



Chenyin Chu
PhD Student
Applied Mathematics



Sin Yee Yap
PhD Student
Computer Science



Adam Manoogian
PhD Student
Philosophy



Lars Sandved-Smith
PhD Student
Physics



Vidushani Dhanawansa
PhD Student
Electronic Engineering



Salma Mansour
PhD Student
Psychology



Adrian May
Research Officer
Pharmacology

Brain as input-state-output system

- **Inputs:** experimental manipulations
 - External input on brain, e.g. visual stimuli
 - Context, e.g. attention
- **State (hidden) variables:** neuronal activities in the brain
- **Outputs:** electromagnetic or hemodynamic responses over brain regions
 - Measured in scanner

Dynamic Causal Modelling

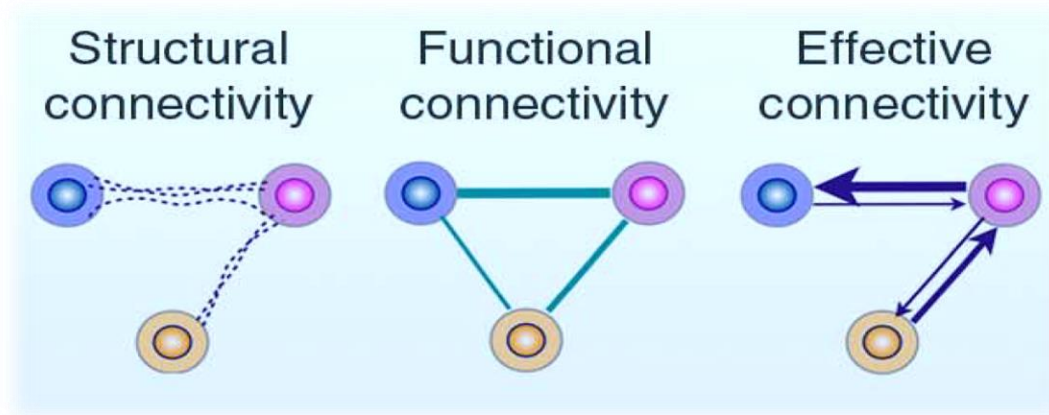
is a framework

for inferring neural responses / effective connectivity

in the brain

Brain connectivity

structural, functional and effective



Structural connectivity

presence of axonal connections

Functional connectivity

statistical dependencies between regional time series

Effective connectivity

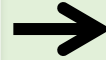
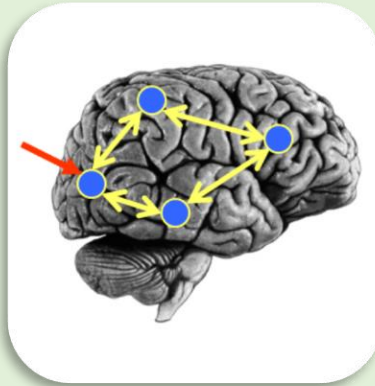
causal (directed) influences between hidden neuronal populations

DCM Framework

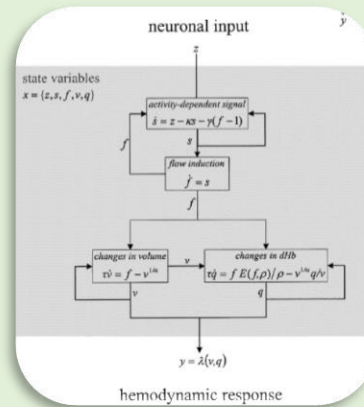
Experimental
Stimulus (u)



Neural Model



Observation Model



Observations (y)



How brain
activity \mathbf{x}
changes over
time

$$\dot{\mathbf{x}} = \mathbf{f}(\mathbf{x}, \mathbf{u}, \boldsymbol{\theta}^n)$$



What we would
see in the
scanner, \mathbf{y} ,
given the
neural model?

$$\mathbf{y} = \mathbf{g}(\mathbf{x}, \boldsymbol{\theta}^h)$$

The system of interest

Experimental Stimulus



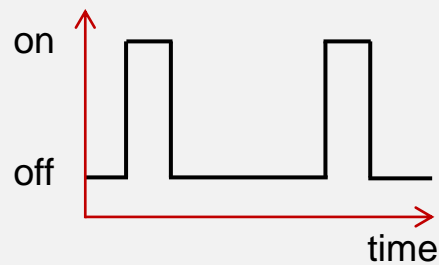
(Hidden) Neural Activity



Observations (BOLD)

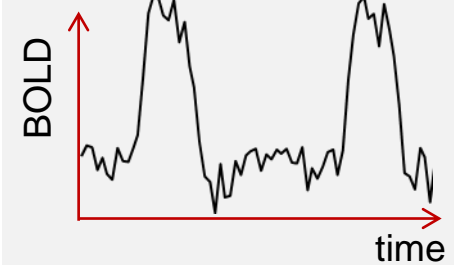


Vector u



?

Vector y

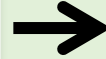
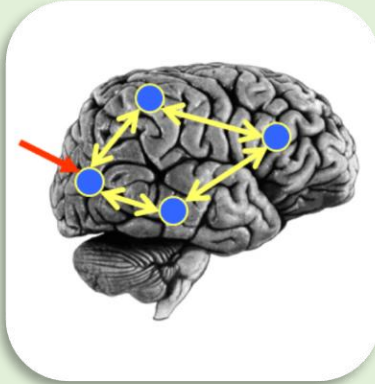


DCM Framework

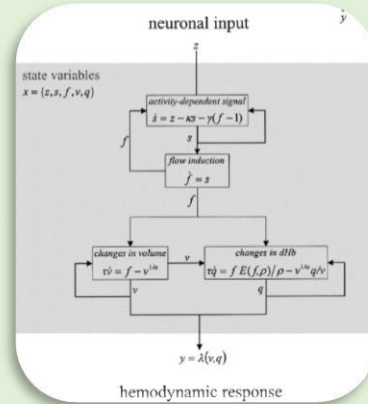
Experimental
Stimulus (u)



Neural Model



Observation Model



Observations (y)



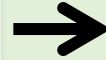
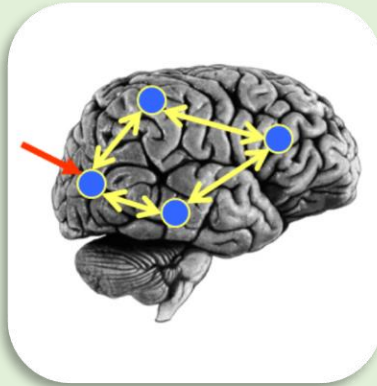
Generative model
 $p(y, u)$

DCM Framework

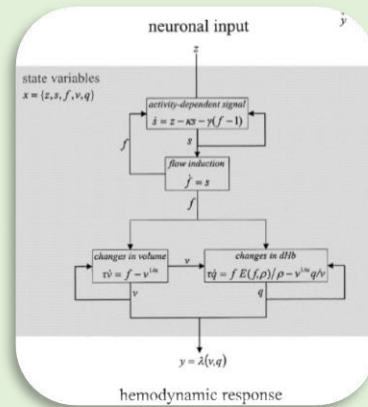
Experimental
Stimulus (u)



Neural Model



Observation Model



Observations (y)

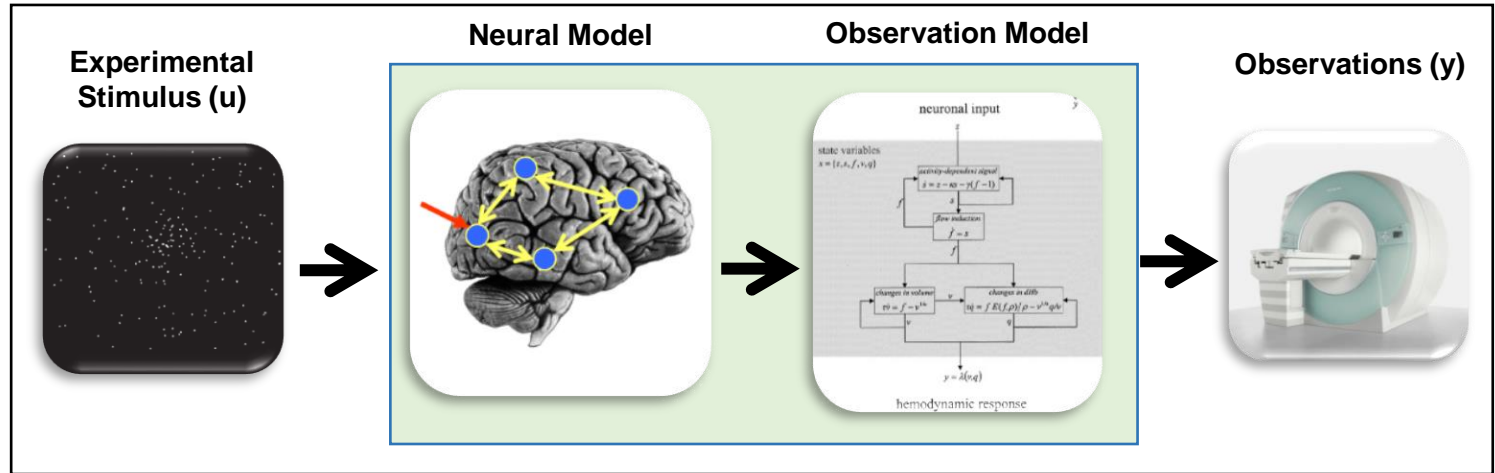


Model Inversion
(Variational EM)

Given our observations y , and
stimuli u , what parameters θ make
the model best fit the data?

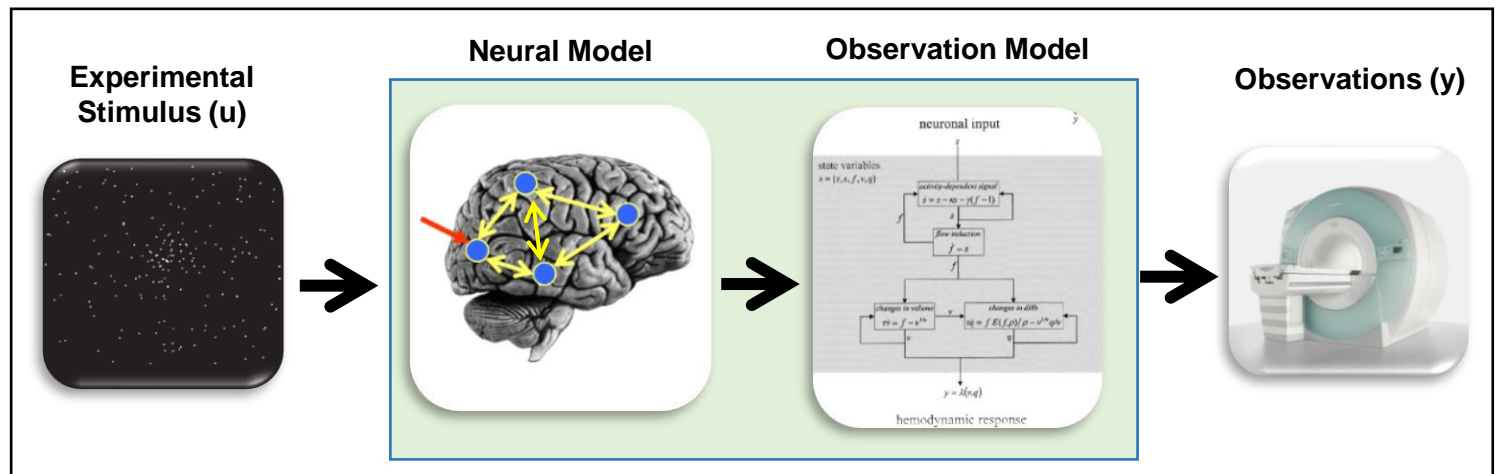
DCM Framework

Model 1:



Model comparison: Which model best explains my observed data?

Model 2:



Where DCM sits in the pipeline?



Functional MRI
acquisition and
image reconstruction

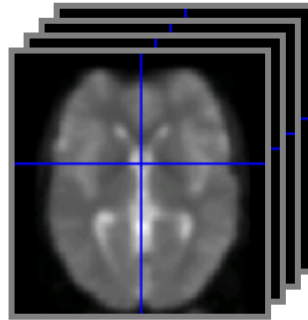
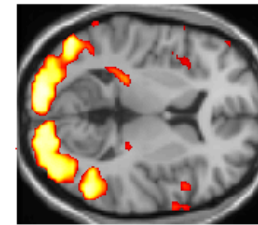
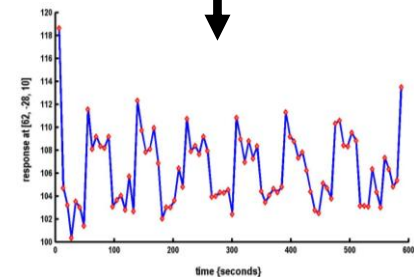


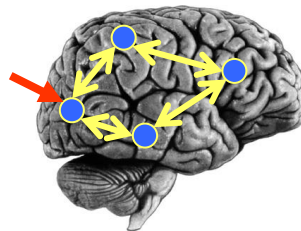
Image preprocessing
(realignment, coregistration,
normalisation, smoothing)



Statistical Parameter
Mapping (SPM) /
General Linear
Model



Timeseries extraction from
Regions of Interest (ROIs)

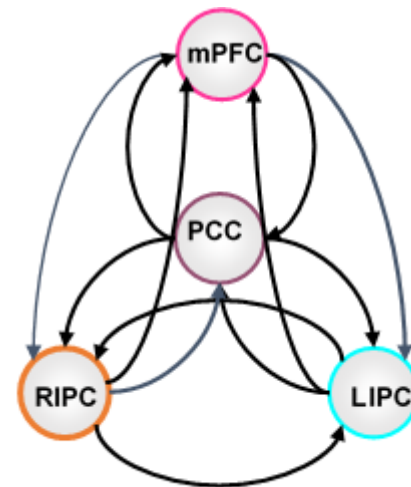


Dynamic Causal Modelling
(DCM)

Worked example (using GUI)

1. **GLM estimation – to get SPM.mat**
2. **Extraction of time series from ROIs**
3. **Specify DCM**
4. **Estimate DCM**
5. **Review DCM**

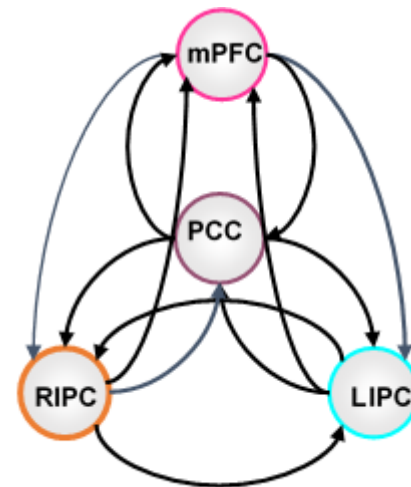
PCC	[0 -52 26]
mPFC	[3 54 -2]
L-IPC	[-50 -63 32]
R-IPC	[48 -69 35]



Worked example (using code/script)

1. **GLM estimation – to get SPM.mat**
2. **Extraction of time series from ROIs**
3. **Specify DCM**
4. **Estimate DCM**
5. **Review DCM**

PCC	[0 -52 26]
mPFC	[3 54 -2]
L-IPC	[-50 -63 32]
R-IPC	[48 -69 35]

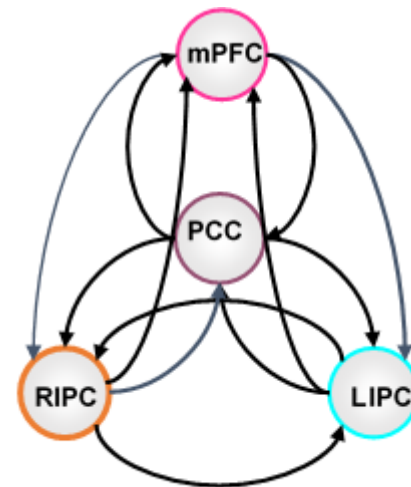


Worked example

for multiple patients using for loop

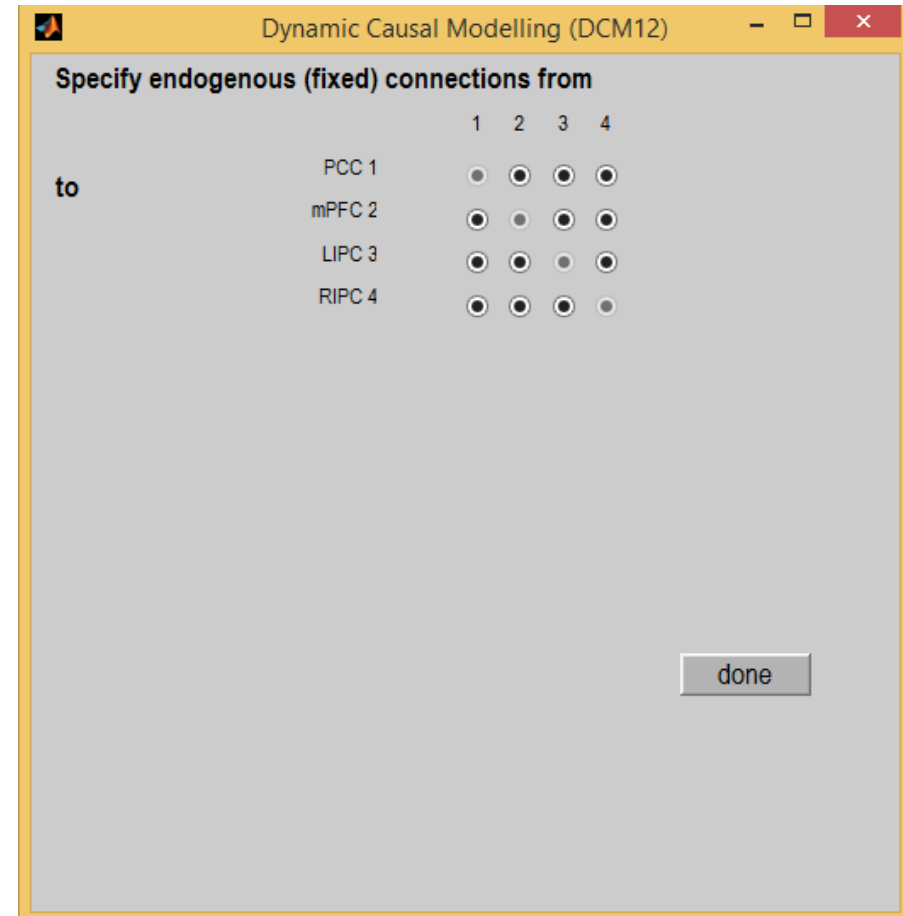
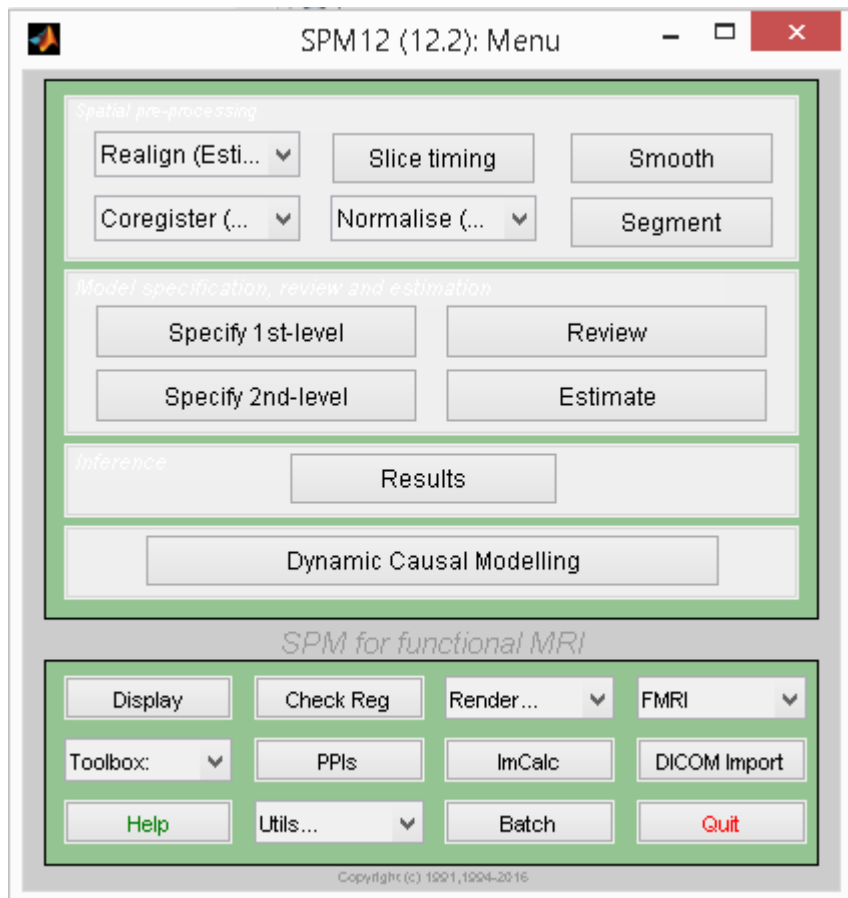
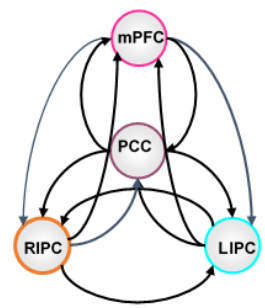
1. GLM estimation – to get SPM.mat
2. Extraction of time series from ROIs
3. Specify DCM
4. Estimate DCM
5. Review DCM

PCC	[0 -52 26]
mPFC	[3 54 -2]
L-IPC	[-50 -63 32]
R-IPC	[48 -69 35]



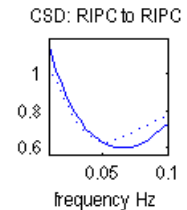
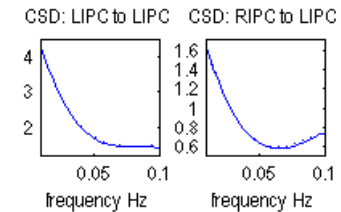
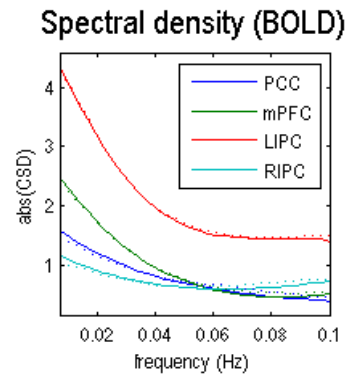
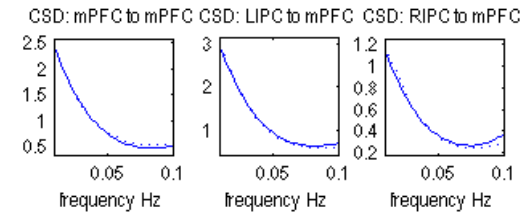
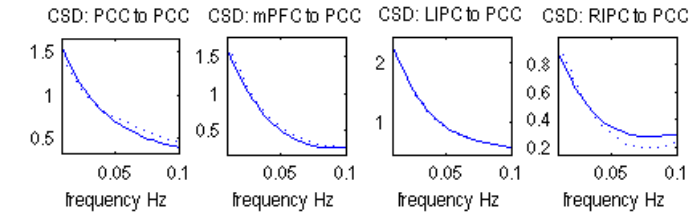
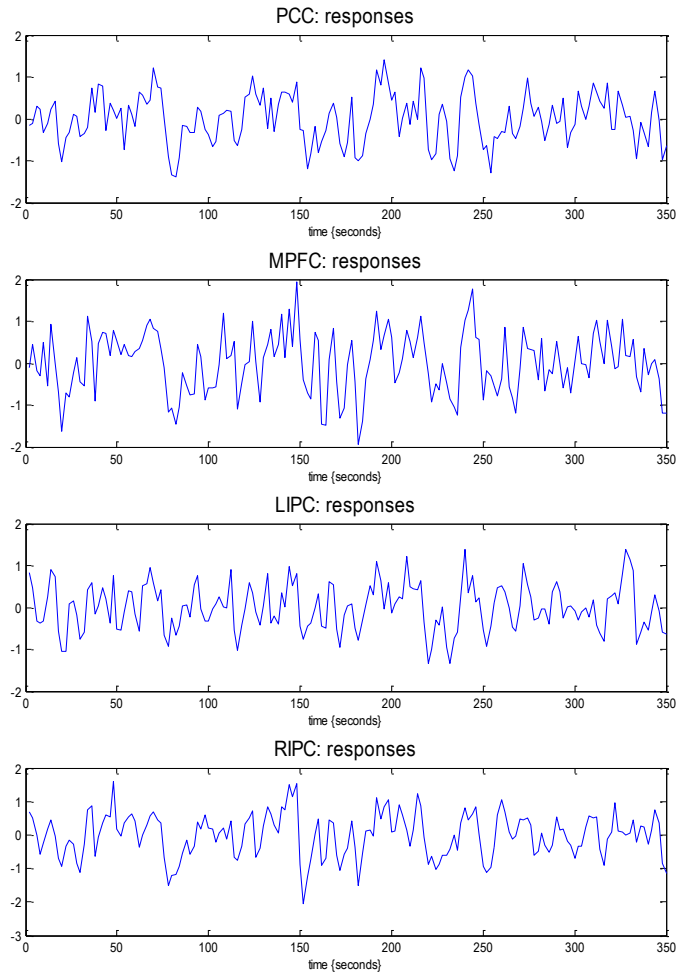
Worked example

Default mode network



Worked example

Default mode network

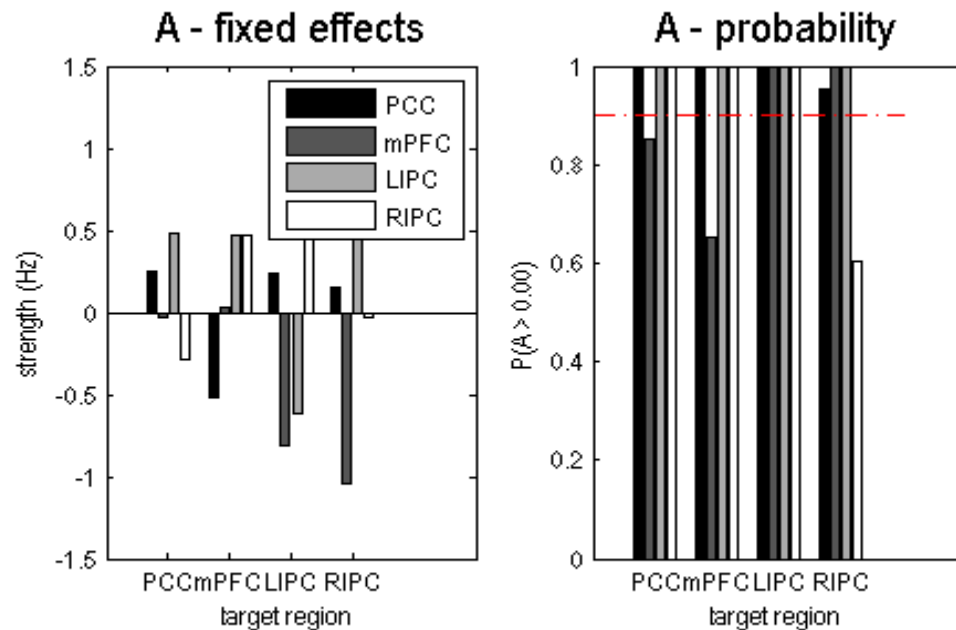


Input time series

Data fits for CSD

Worked example

Default mode network



Connectivity parameters: DCM.Ep.A
Neural fluctuation parameters: DCM.Ep.a

```
>> load('DCM_DMN.mat')
>> DCM.Ep.A

ans =

    0.2451    -0.0359    0.4764    -0.2926
   -0.5201     0.0349    0.4647     0.4746
    0.2431   -0.8065   -0.6187     1.1881
    0.1499   -1.0462    0.8346    -0.0293

>> DCM.Ep.a

ans =

   -0.6714   -0.5323    4.2406   -0.5629
  -1.3155   -1.1841   -2.2338   -0.8349
```