

# Can E-I balance provide a mechanism for Brain network recovery to normalcy

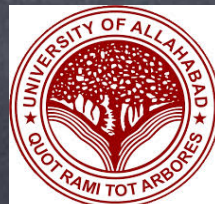
Dipanjan Roy

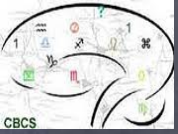
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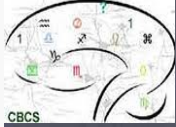
# Outline

## **Alteration of connectivity and BOLD dynamics following lesion**

Impact of virtual brain lesions and altered structural Connectivity:  
Impact on resting-State FC

Functional Connectivity recovery to normalcy: reorganization of neurocognitive networks using robust inhibitory plasticity mechanism

Outlook

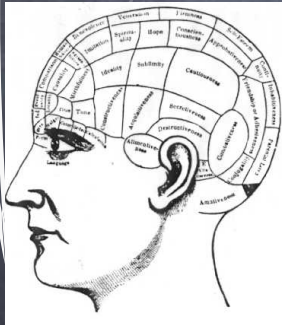


# Division in processing: Localization versus globalism



## Localism

- Functions are localised in anatomic cortical regions
- Damage to a region results in loss of function



## Functional Segregation

- Functions are carried out by specific areas/cells in the cortex that can be anatomically separated

### Functional Segregation

Different areas of the brain are specialised for different functions

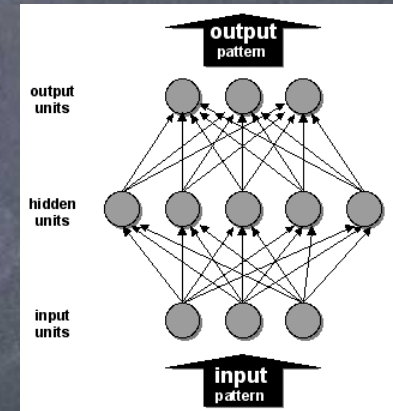
## Globalism

- The brain works as a whole, extent of brain damage is more important than its location



## Connectionism

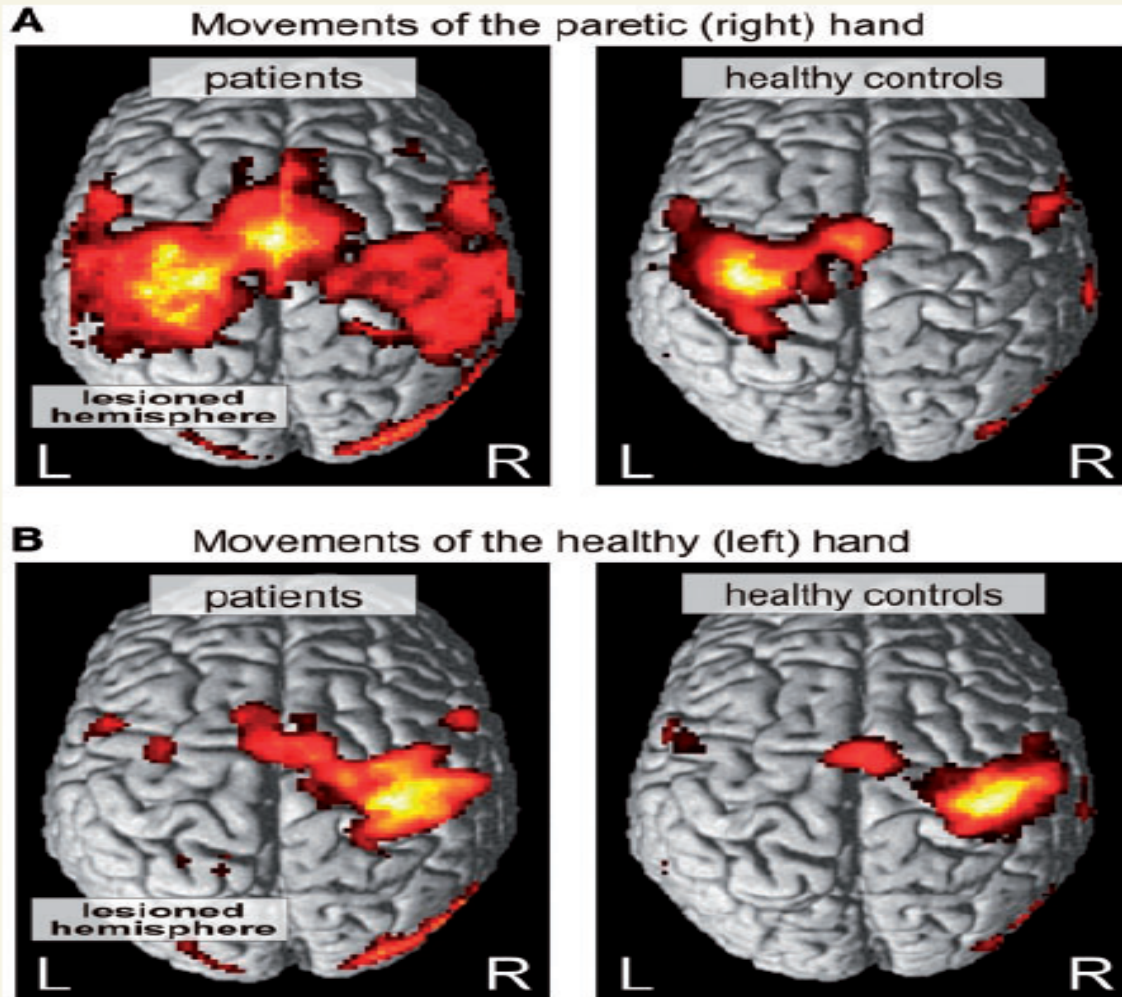
- Networks of simple connected units

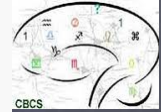


### Functional Integration

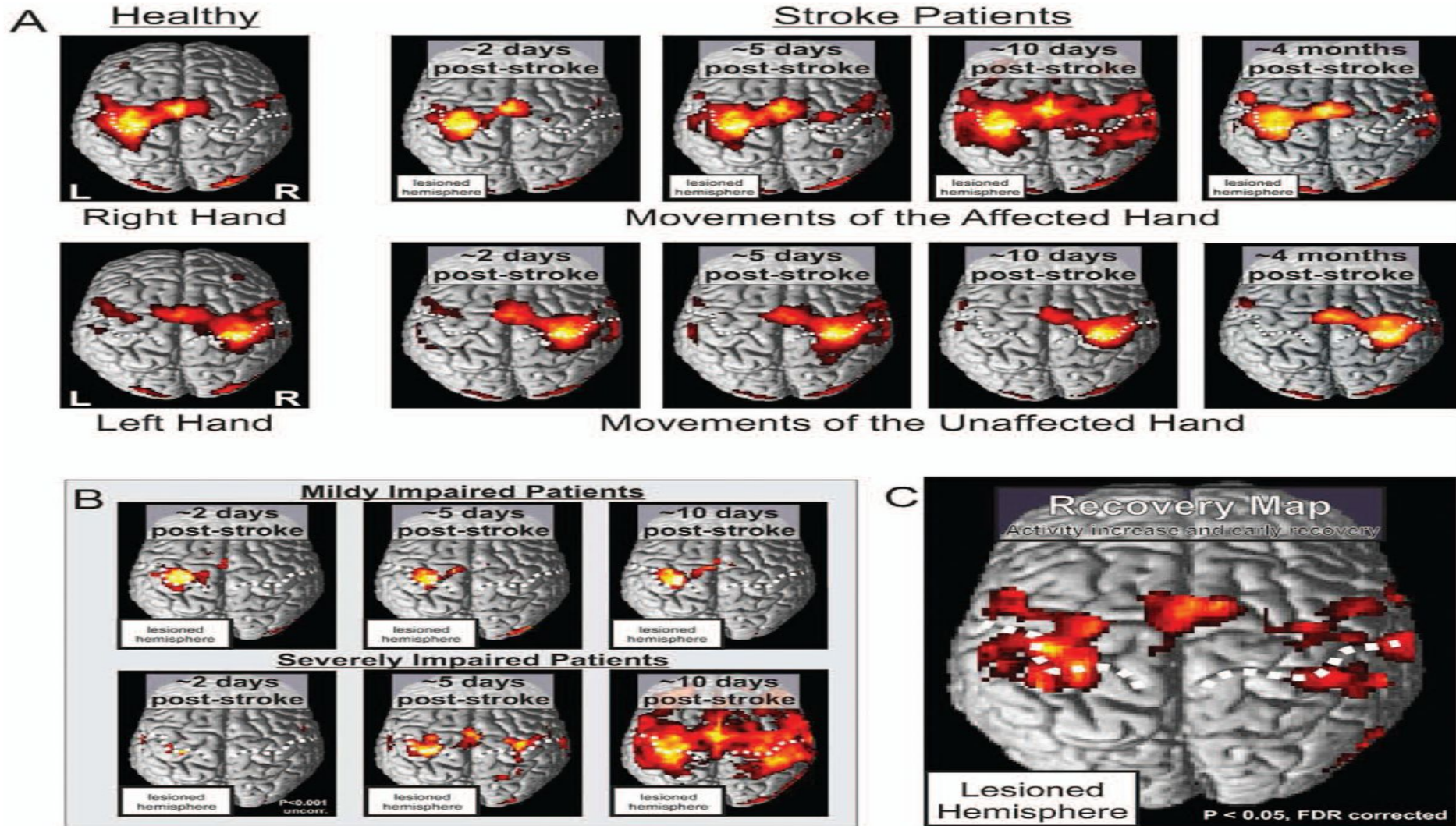
Networks of interactions among specialised areas

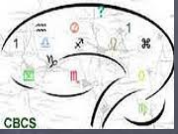
# Movement generations and hemodynamic response on the contralesional side of Ischemic stroke patients





# Tracking Longitudinal progression in motor network activity in stroke patients





# Outline

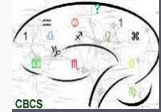
Introduction to Brain Networks and topological connectivity measures

Alteration of connectivity and dynamics following lesion

## **Impact of virtual brain lesions and altered structural Connectivity: Impact on resting-State FC**

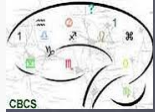
Functional Connectivity recovery to normalcy: reorganization of neurocognitive networks using robust inhibitory plasticity mechanism

Outlook



# Table of *in-silico* lesion areas covering 80%-90% of the cerebral cortex

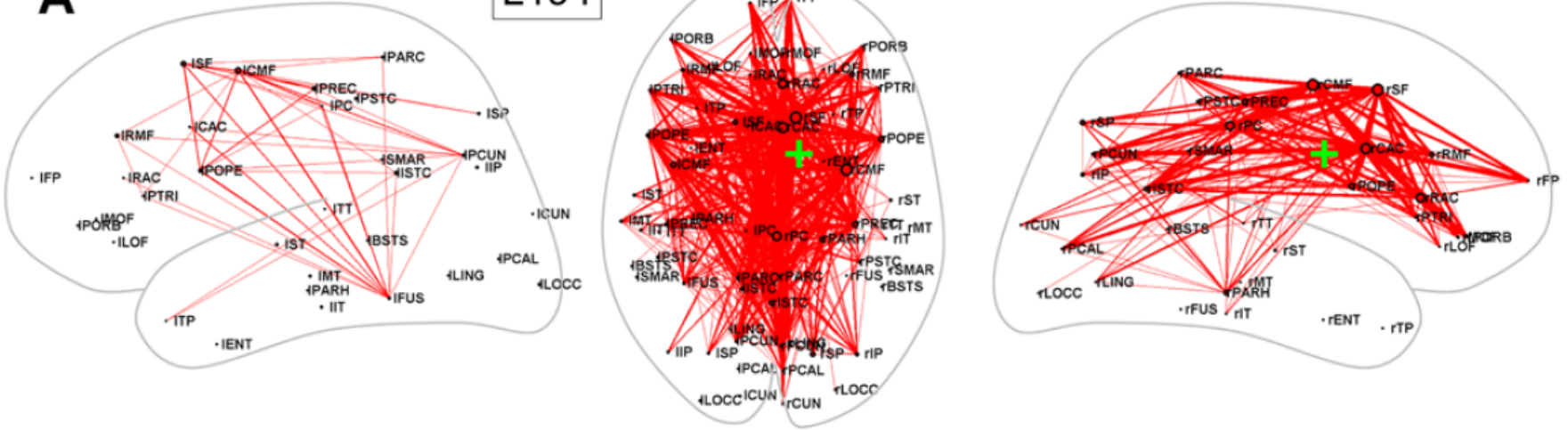
<b>Right Hemisphere</b>					
	<b>Lesion name</b>	<b>ROI center</b>	<b>Talairach coordinate</b>	<b>Center region</b>	<b>Lesioned regions</b>
Cortical midline	L323	323	(6, -56, 38)	rPCUN	rCUN, rISTC, rPCUN
	L194	194	(5 16 31)	rCAC	rCAC, rCMF, rSF
Parietal and temporal cortex	L308	308	(47 -51 22)	rIP	rBSTS, rIP, rSMAR
	L247	247	(62 -31 28)	rSMAR	rPSTC, rSMAR, rTT
	L472	472	(65 -32 10)	rST	rBSTS, rMT, rST, rSMAR, rTT
	L439	439	(50 -11 -29)	rIT	rENT, rIT, rST, rTP
Frontal cortex	L86	86	(7 48 21)	rSF	rCAC, rFP, rRAC, rRMF, rSF
	L138	138	(39 9 51)	rCMF	rCMF, rPREC
	L57	57	(40 9 21)	rPOPE	rCMF, rPOPE
Sensory, motor	L360	360	(26 -94 -6)	rLOCC	rLOCC, rLING, rPCAL
	L162	162	(34 -23 46)	rPREC	rPSTC
<b>Left Hemisphere</b>					
	<b>Lesion name</b>	<b>ROI center</b>	<b>Talairach coordinate</b>	<b>Center region</b>	<b>Lesioned regions</b>
Cortical midline	L821	821	(-8 -57 47)	IPCUN	IISTC, IPCUN, ISP
	L692	692	(-7 26 26)	ICAC	ICAC, IRAC, ISF
Parietal and temporal cortex	L810	810	(-45 -50 20)	IIP	IBSTS, IIP
	L746	746	(-58 -25 28)	ISMAR	IPSTC, ISMAR
	L971	971	(-61 -36 12)	IST	IBSTS, IMT, ISMAR, ITT
	L938	938	(-44 -10 -26)	IIT	IENT, IIT, IMT, IPARH, IST, ITP
Frontal cortex	L584	584	(-8 52 17)	ISF	ICAC, IFP, IRAC, IRMF
	L636	636	(-39 7 42)	ICMF	ICMF, IPREC
	L555	555	(-42 22 18)	IPOPE	ICMF, IPOPE, IPTRI, IRMF
Sensory, motor	L856	856	(-25 -93 -7)	ILOCC	ILOCC, ILING, IPCAL
	L661	661	(-34 -9 52)	IPREC	IPREC



# Lesion severity in the cortical midline Hub area DMN

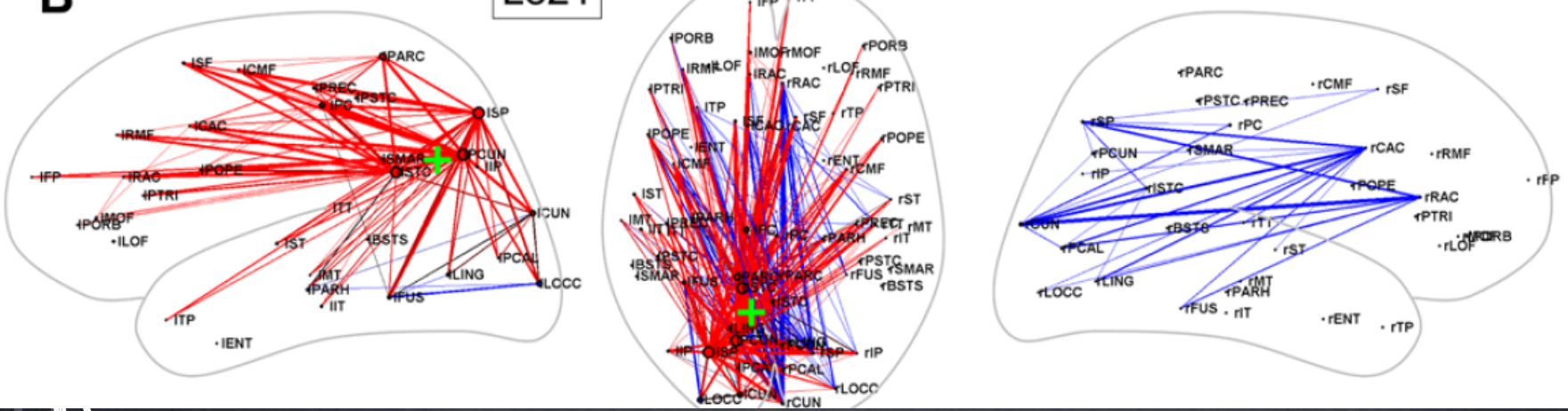
**A**

L194



**B**

L821







# Outline

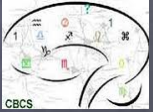
Introduction to Brain Networks and topological connectivity measures

Alteration of connectivity and dynamics following lesion

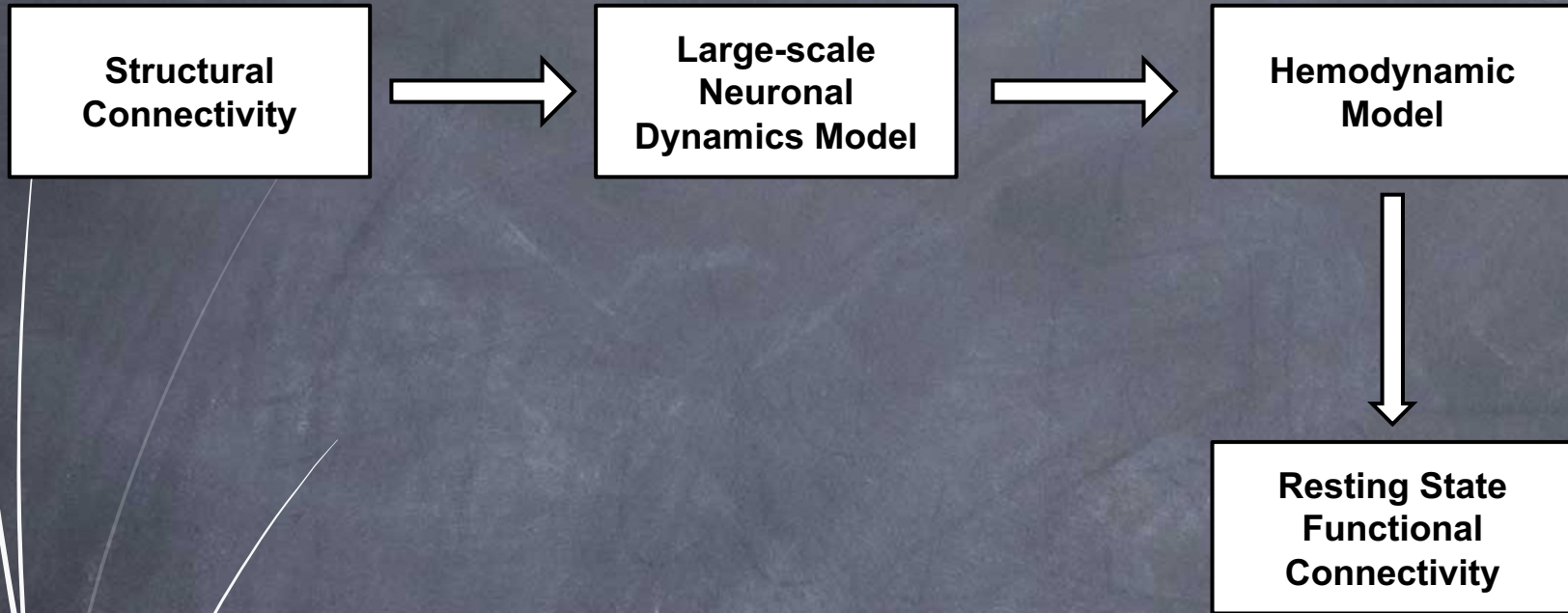
**Impact of virtual brain lesions and altered structural Connectivity:  
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reorganization of neurocognitive networks using  
robust inhibitory plasticity mechanism**

Outlook



# Predicting rs-FC from SC



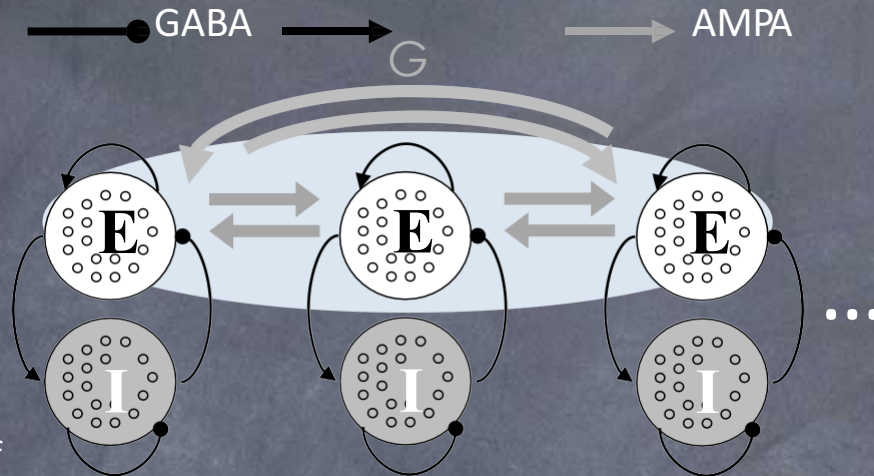
**Structural Connectivity**  
**Neuronal Dynamics Model**  
**Hemodynamic Model**  
**rs-FC**

: Obtained from DTI  
: Dynamic Mean Field model  
: Balloon-Windkessel hemodynamic model  
: Pairwise Correlation matrix of BOLD time series





# Mean field approximation



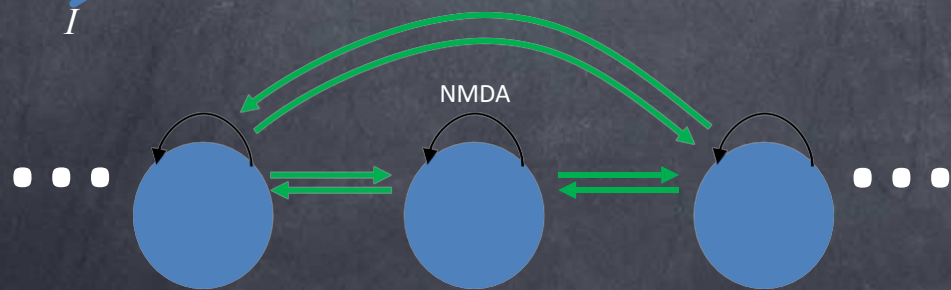
linear approximation of the transfer function of the inhibitory cells

(inhibitory cells typically fire between 8–15 Hz. Within this range, the F-I curve is almost linear)



Mean field approx.

$$\tau_{NMDA} \gg \tau_{AMPA}, \tau_{GABA}$$



Reduced dynamic mean field model

Neurons



Population synaptic activity

# Model Contd...

$$I_i^{(E)} = W_E I_0 + w_+ J_{NMDA} S_i^{(E)} + G J_{NMDA} \sum_j C_{ij} S_j^{(E)} - J_i S_i^{(I)} \quad (1)$$

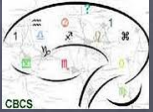
$$I_i^{(I)} = W_I I_0 + J_{NMDA} S_i^{(E)} - S_i^{(I)} \quad (2)$$

$$r_i^{(E)} = \frac{a_E I_i^{(E)} - b_E}{1 - \exp(-d_E(a_E I_i^{(E)} - b_E))} \quad (3)$$

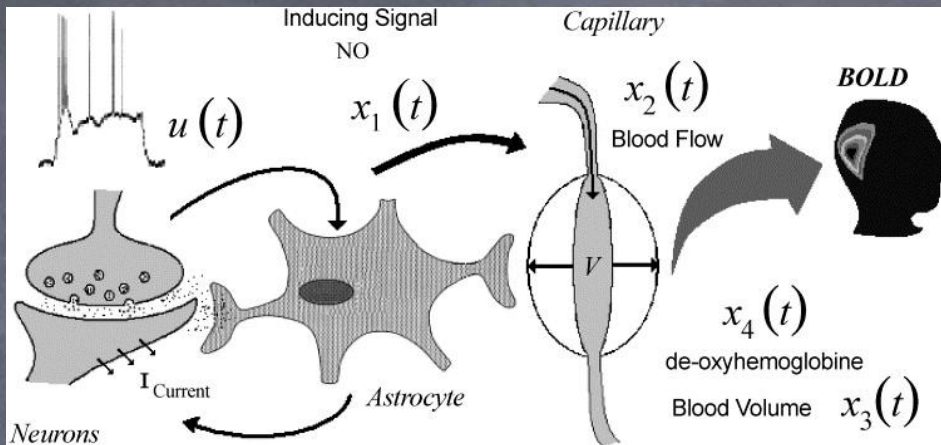
$$r_i^{(I)} = \frac{a_I I_i^{(I)} - b_I}{1 - \exp(-d_I(a_I I_i^{(I)} - b_I))} \quad (4)$$

$$\frac{dS_i^{(E)}(t)}{dt} = -\frac{S_i^{(E)}}{\tau_E} + (1 - S_i^{(E)})\gamma r_i^{(E)} + \sigma v_i(t) \quad (5)$$

$$\frac{dS_i^{(I)}(t)}{dt} = -\frac{S_i^{(I)}}{\tau_I} + r_i^{(I)} + \sigma v_i(t) \quad (6)$$



# The Balloon-Windkessel model



Vessel ~ inflatable balloon

Riera et al. (2004)

$$\dot{x}_i = z_i - k_i x_i - \gamma_i f_i - 1$$

$$f_i = x_i$$

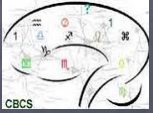
$$\tau_i \dot{v}_i = f_i - v_i^{1/\alpha}$$

$$\tau_i \dot{q}_i = \frac{f_i}{\rho} \left[ 1 - 1 - \rho^{1/f_i} \right] - q_i v_i^{1/\alpha - 1}$$

$$BOLD_i = V_0 \left[ k_1 (1 - q_i) + k_2 (1 - q_i / v_i) + k_3 (1 - v_i) \right]$$

For the  $i$ -th region, **synaptic activity**  $z_i$  causes an increase in a **vasodilatory signal**  $x_i$ .

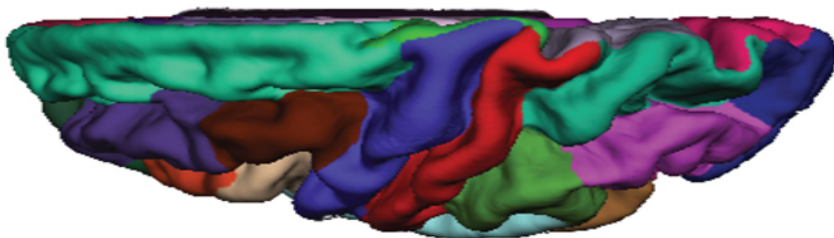
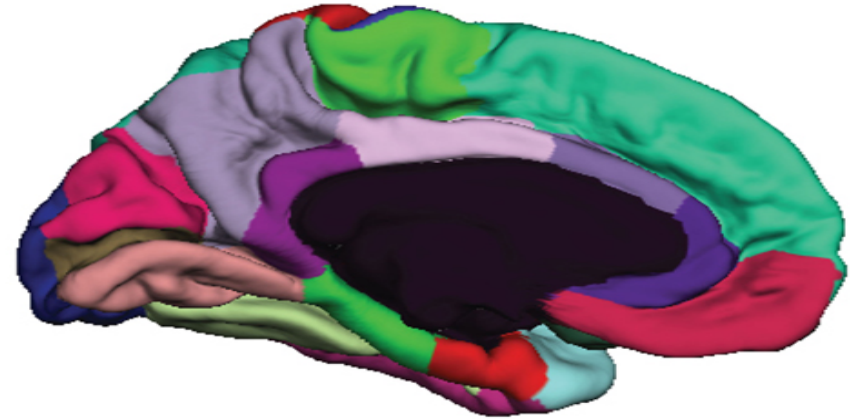
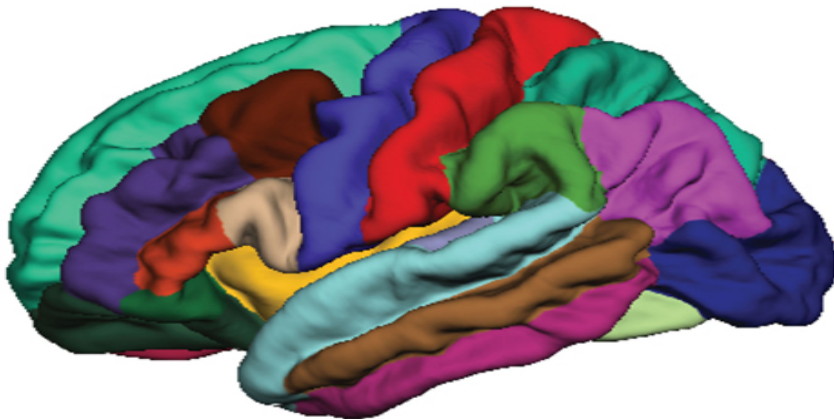
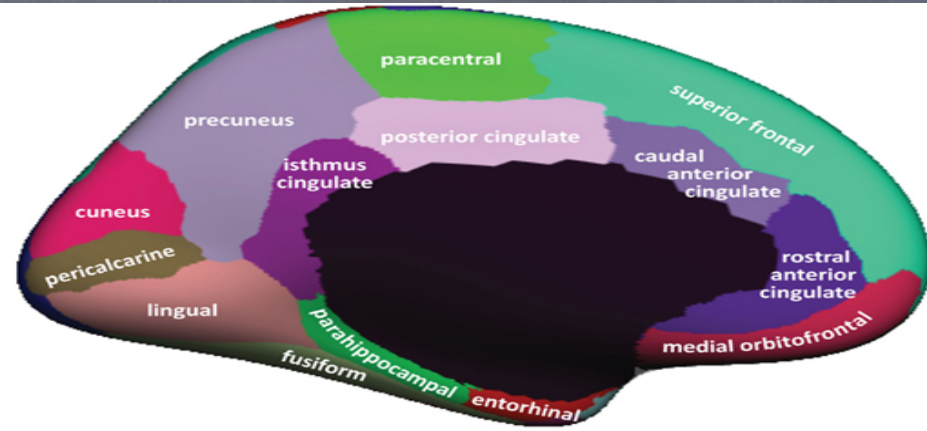
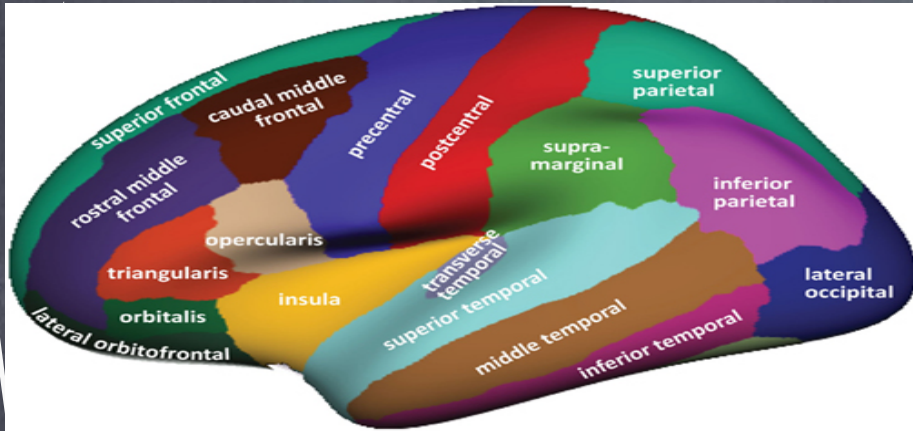
**Inflow**  $f_i$  responds to this signal with changes in blood **volume**  $v_i$  and **deoxyhemoglobin content**  $q_i$ .

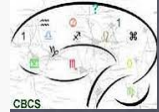


# Data Collection

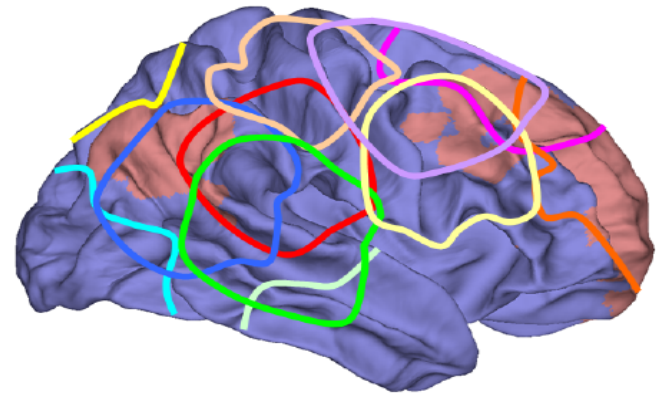
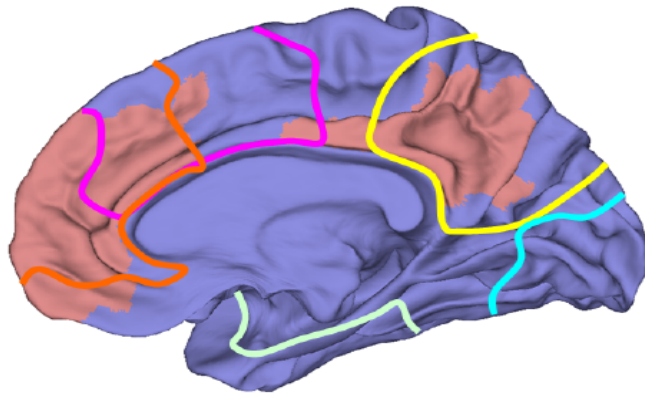
- 49 subjects
- Ages 18 – 82
- Resting state fMRI (3T scanner, single run, 22 mins, voxel size 3 x 3 x 3 mm)
- DTI (voxel size 2.3 x 2.3 x 2.3 mm)

# Parcellation of the cerebral cortex using DK Atlas

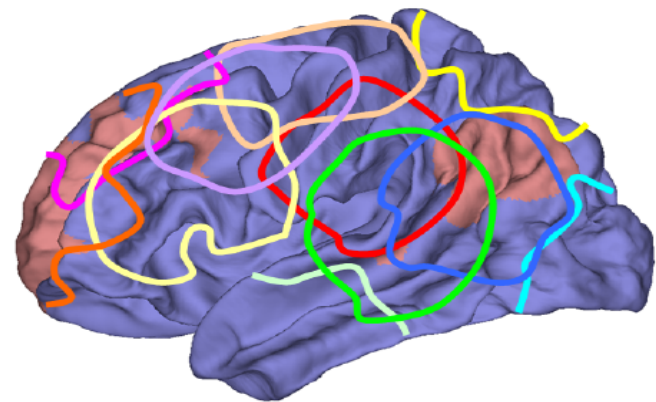
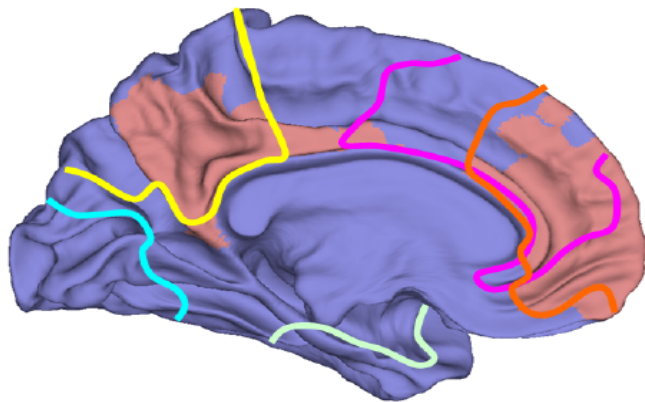




# Lesion centers in the proximity of DMN



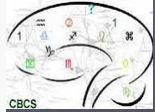
L323 L247 L360 L194 L308 L439 L86 L162 L472 L57 L138



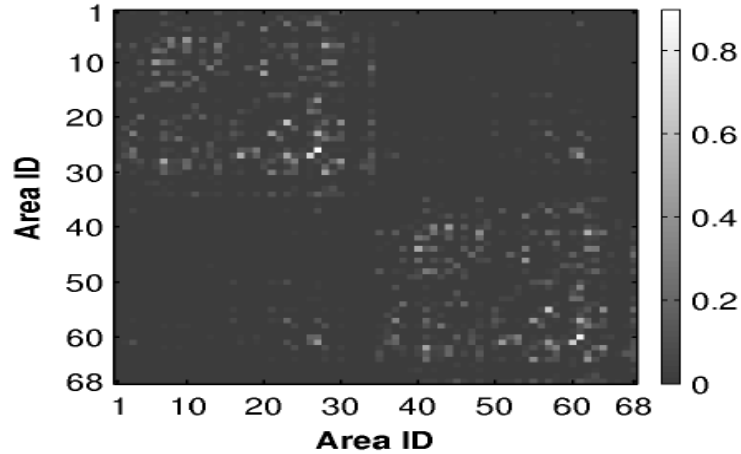
L821 L746 L856 L692 L810 L938 L584 L661 L971 L555 L636



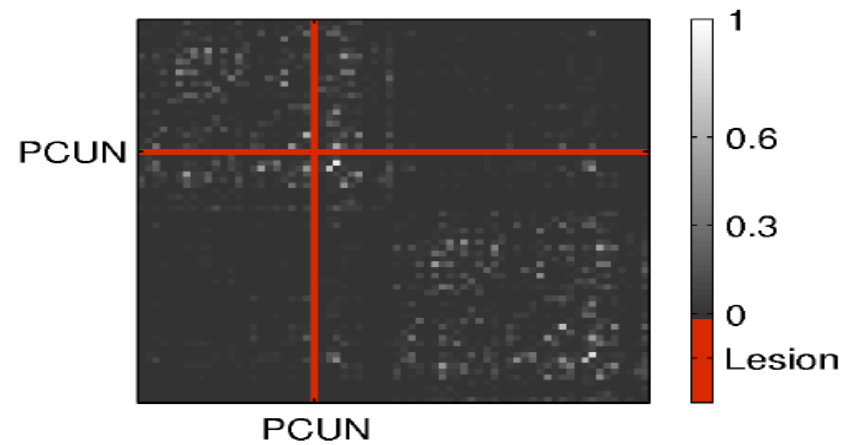
# Generating *in-silico* focal lesion



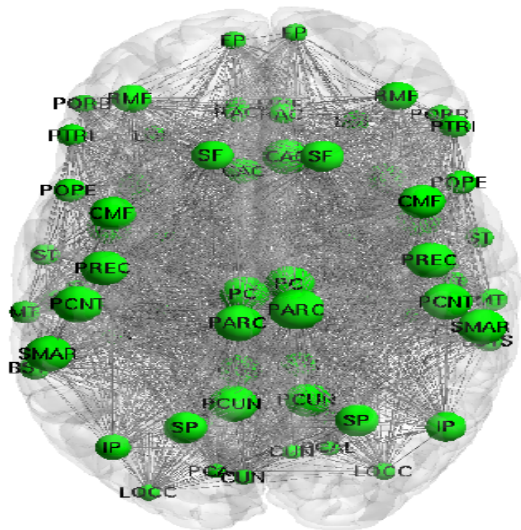
**A**



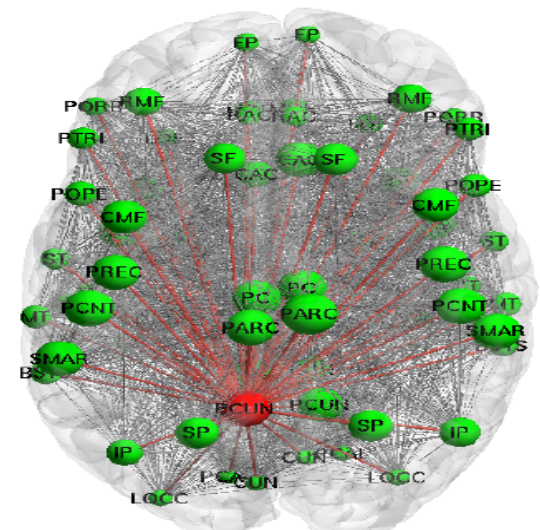
**B**



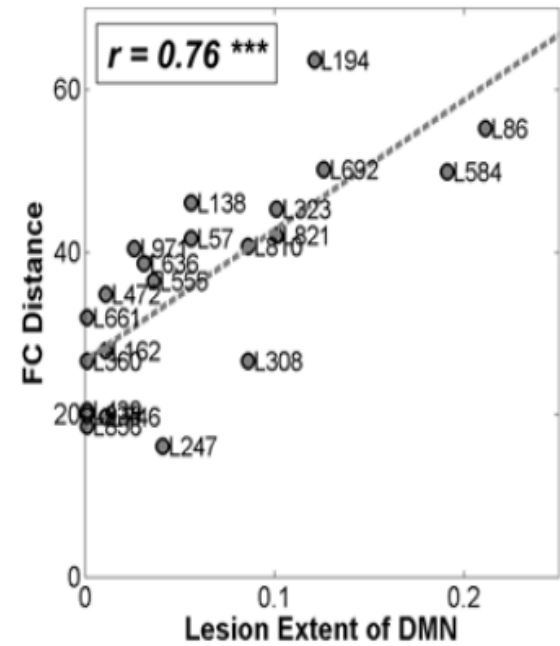
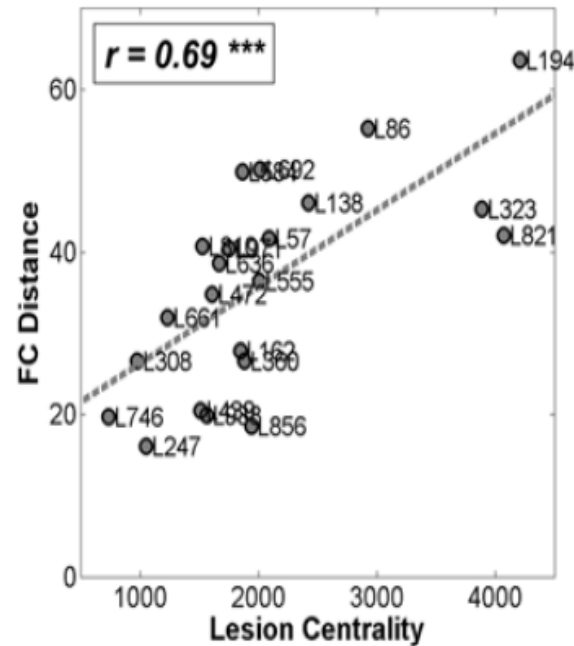
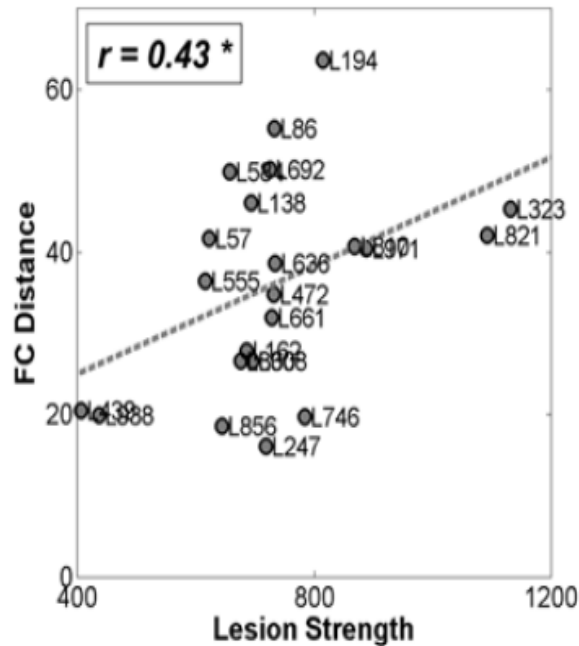
**C**



**D**



# Lesion severity in the brain scales with lesion centrality and node strength

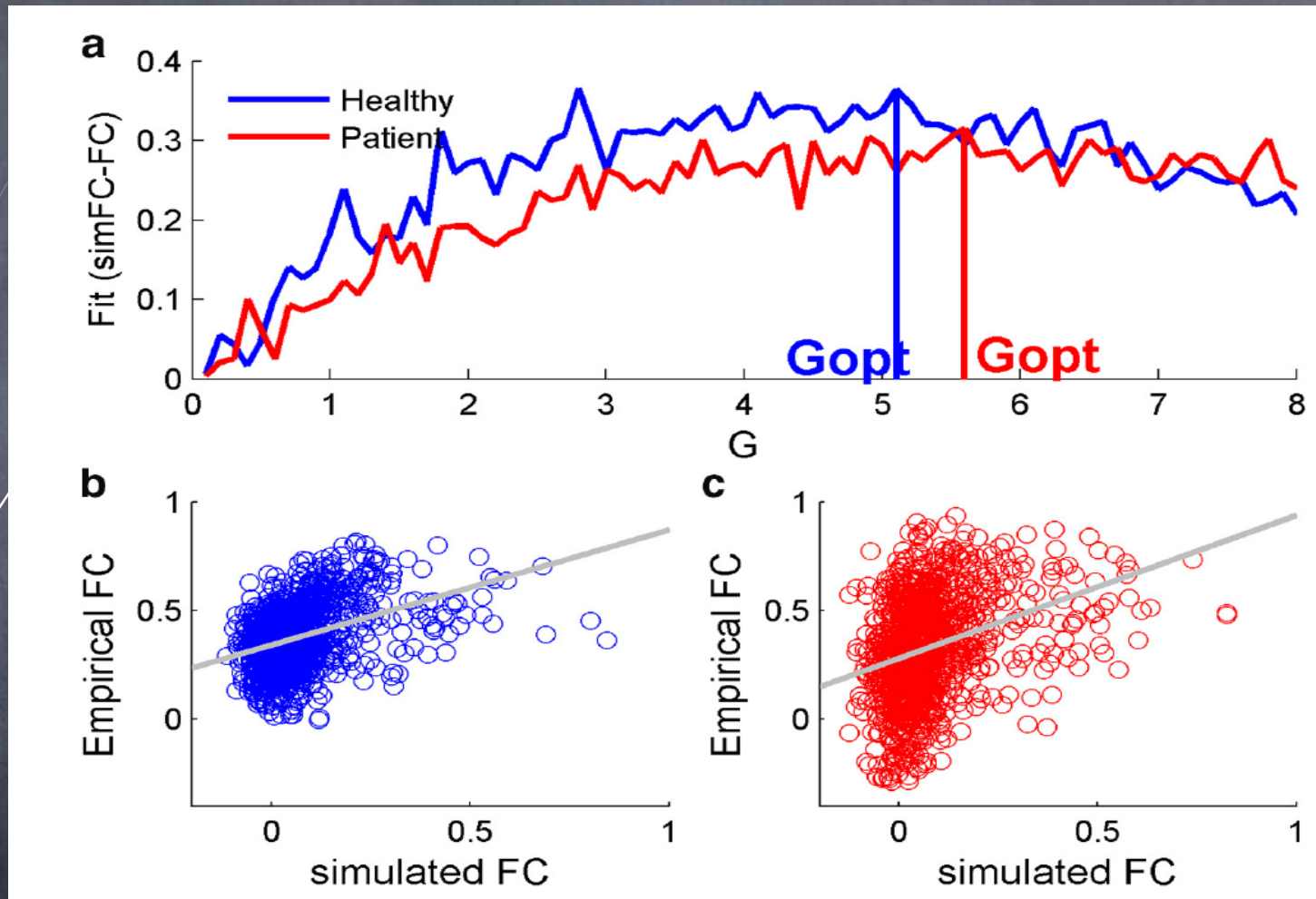


$$FCD = \sqrt{\sum_{i=1}^N \sum_{j=1}^N (FC_{Empirical}(i, j) - FC_{Model}(i, j))^2}$$

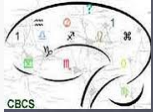
$$Strength(area_i) = \sum_{j=1}^N C_{ij}$$



# Long range coupling between brain areas exhibit significant difference between patient and control



Adhikari et al.(2015) J.Neurosci,  
Vattikonda et al. (2016) Neuroimage

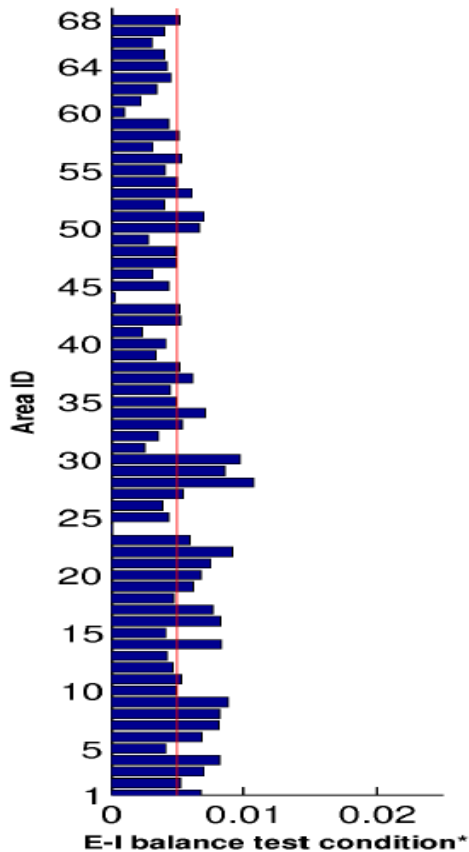


# Impact on excitation-inhibition balance based on the proximity to lesion center

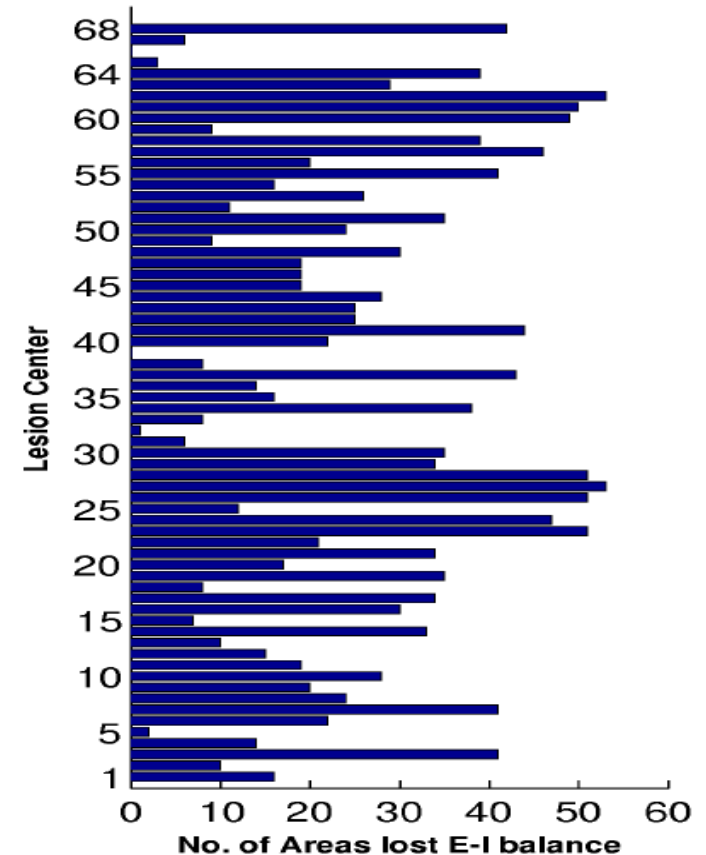
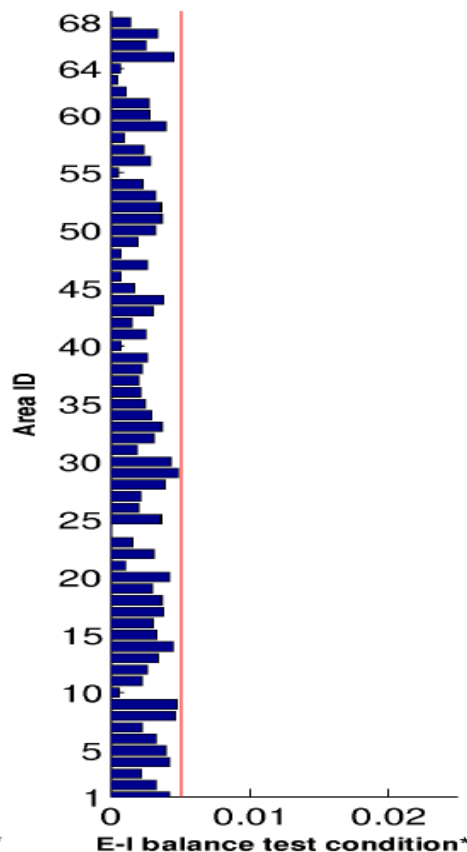
An area, say  $i$ , is considered to have E-I balance if:

$$I_i^E - \frac{b_E}{a_E} = -0.026 \text{ nA, Tolerance: } \pm 0.005 \text{ nA}$$

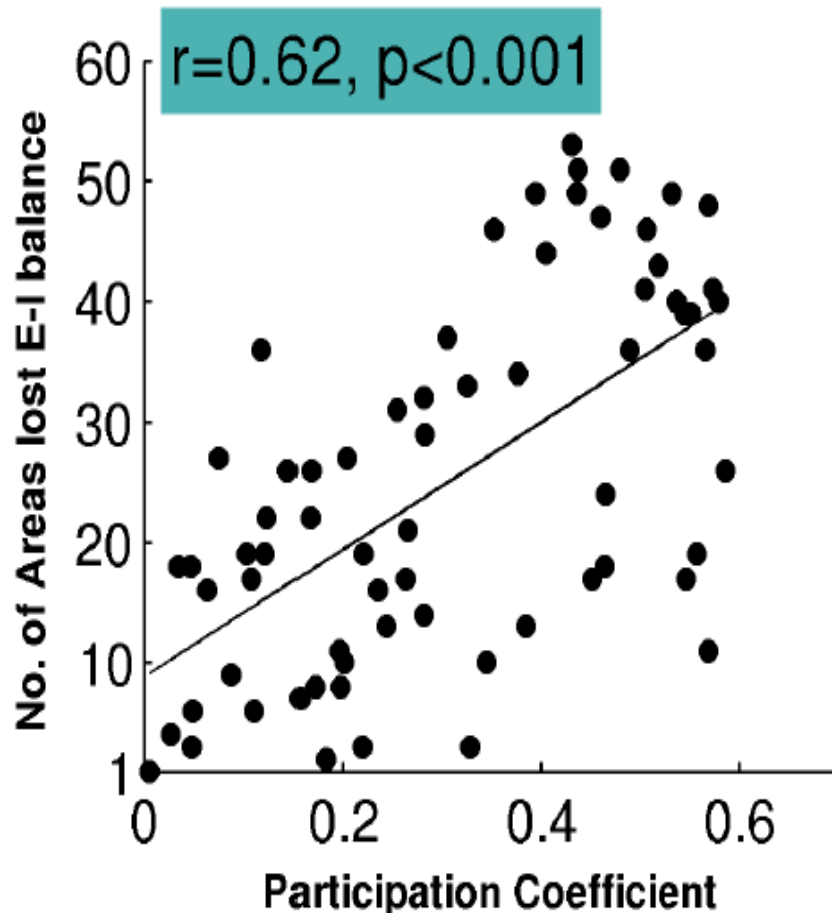
**A**



**B**



# Hub areas has the highest impact on areal E-I balance



- We hypothesize that E-I balance is a potential underlying mechanism that is affected by lesions.
- Since homeostasis play a key role in proper function of neuronal circuits lesions at hubs have larger impact on function
- We found that when nodes with high participation coefficient are lesioned then there is a widespread disturbance in E-I balance.

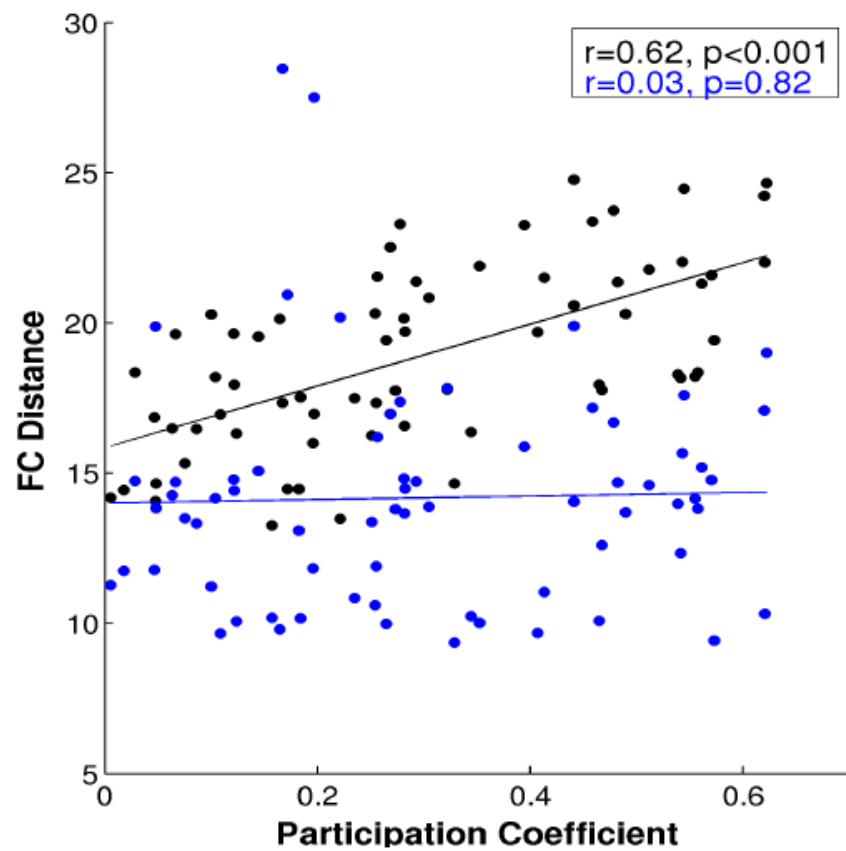
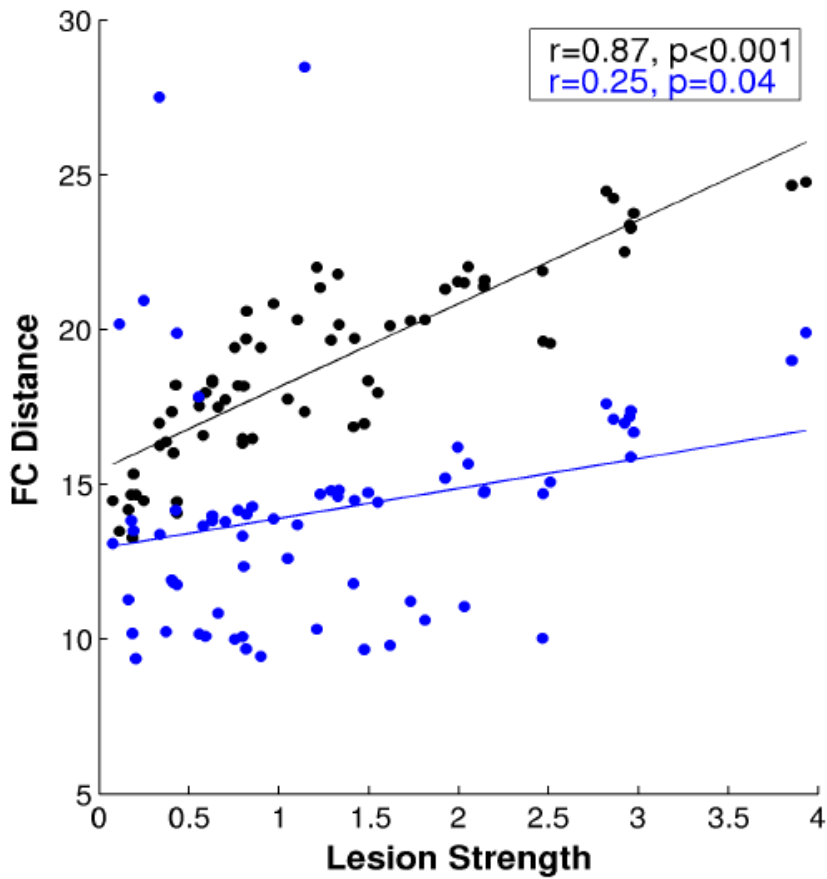




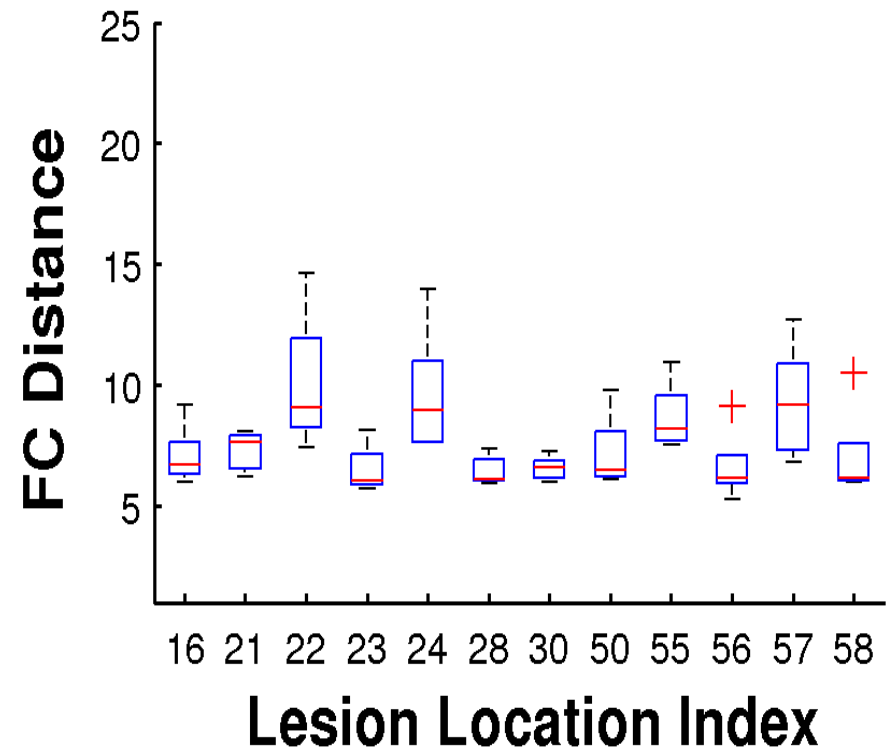
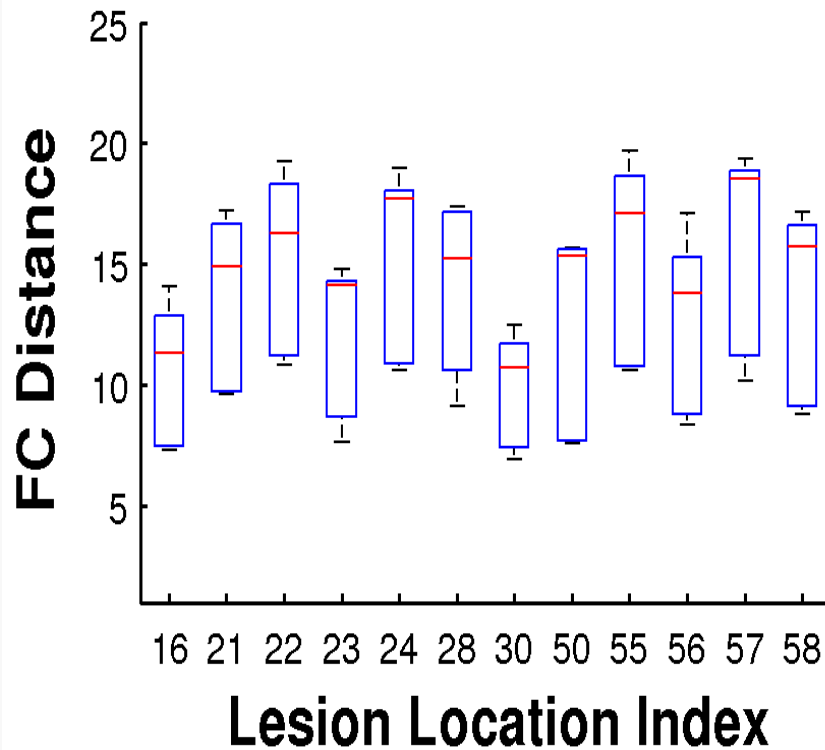
# Functional recovery independent of lesion center location with E-I balance

$$FCD = \sqrt{\sum_{i=1}^N \sum_{j=1}^N (FC_{Empirical}(i, j) - FC_{Model}(i, j))^2}$$

$$P_i = 1 - \sum_{s=1}^{N_M} \left( \frac{k_{is}}{k_i} \right)$$



# Functional recovery across subjects and location of lesion



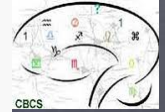
# Functional recovery estimates across variety of lesion centers

- Z-scores are used to test the hypothesis that whether the functional correlations of any pair of ROI before and after lesion are from different distributions.

$$Z_{ij} = \frac{(r_{ij}^{healthy} - r_{ij}^{lesioned})}{\sqrt{(\frac{1}{df-3} + \frac{1}{df-3})}}$$

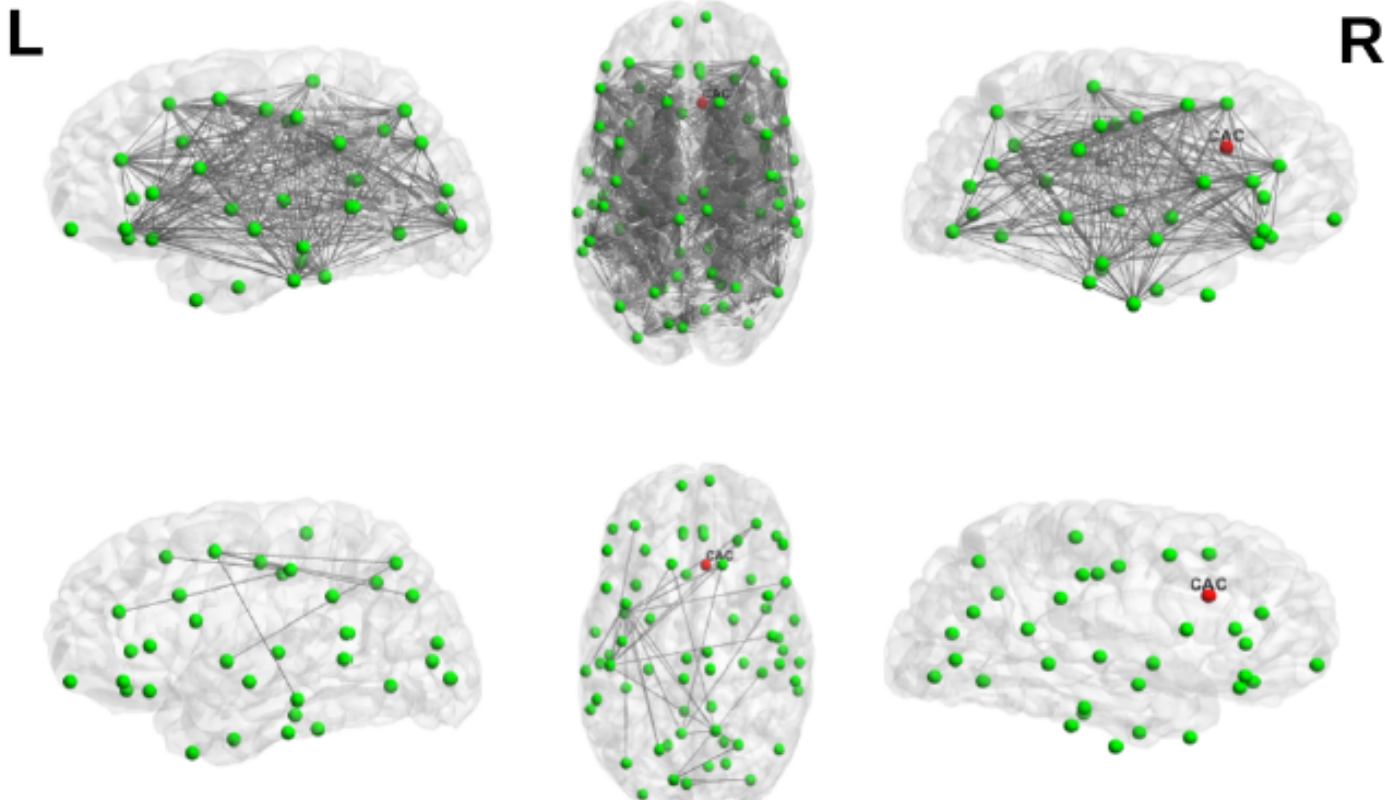
- We have compared the z-scores before and after lesion with lesions located in cortical midline (CAC), frontal cortex (CMF) and parietal cortex (IP).





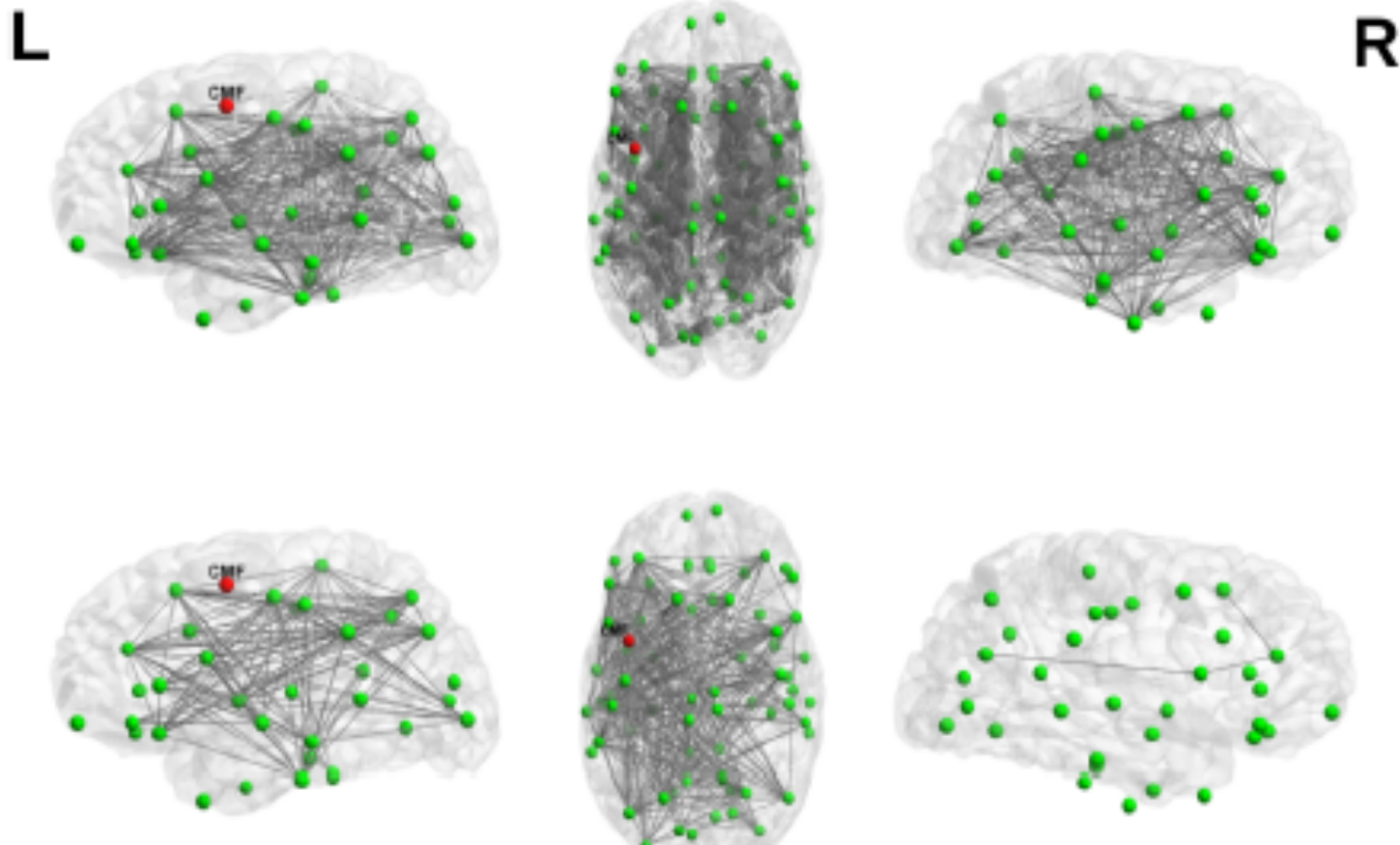
# Functional recovery re-establishing lost areal E-I balance

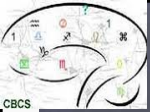
- With Lesion center as CAC, The number of connections that significantly changed within ipsilateral hemisphere is reduced by 97% and within contralateral hemisphere by 100%



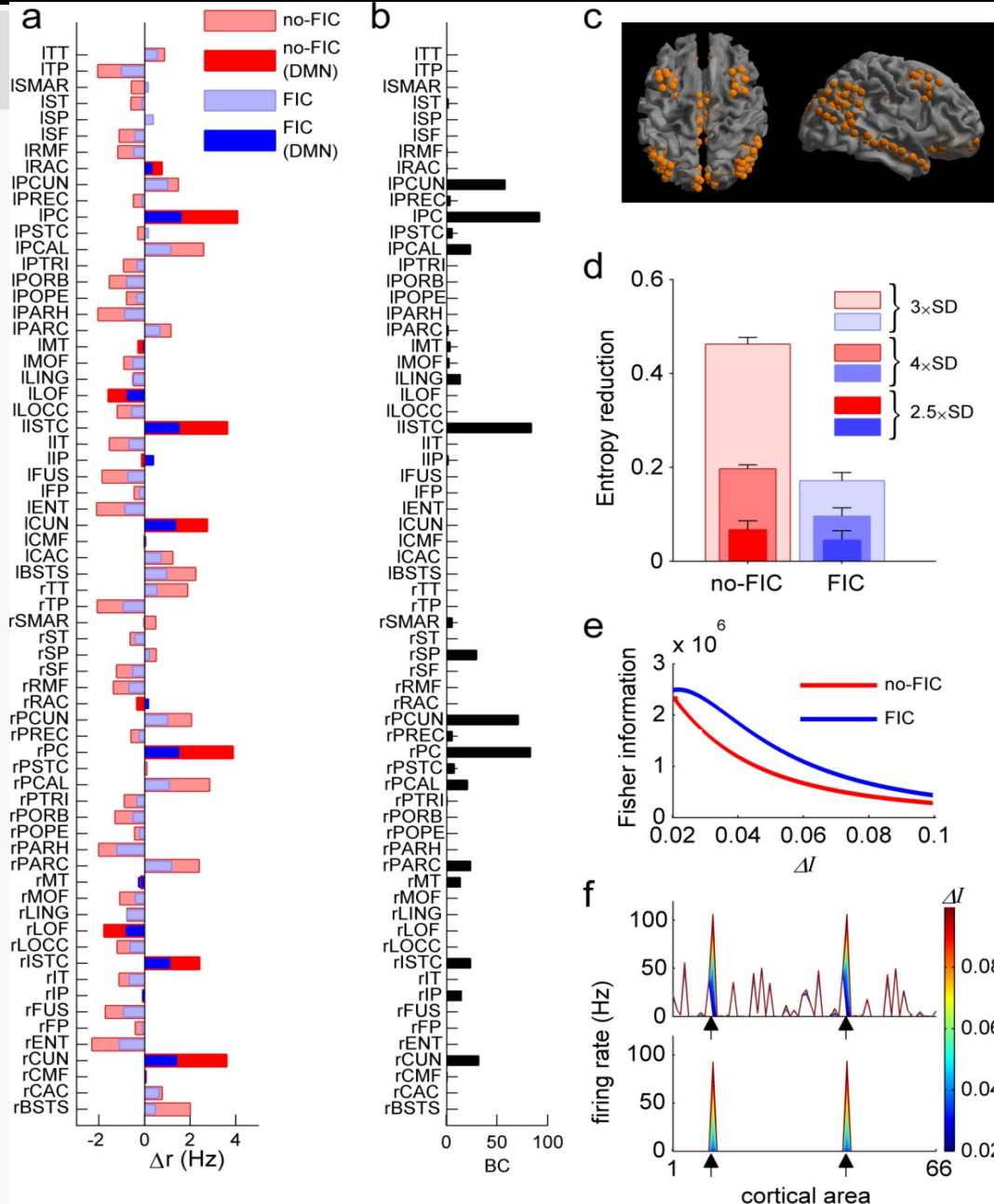
# Impact of lesion hotspot on recovery

- With the lesion center as left CMF, The number of connections that significantly changed within ipsilateral hemisphere is reduced by 61% and within contralateral hemisphere by 99%





# Outlook



- Regulating the local level of feedback inhibition in the brain has an important role at the global level:
- Inhibitory plasticity attenuates the response of cortical areas in the default mode network and recovers FC on distant sites.
- Inhibitory local regulation increases the information capacity of the global network by increasing the entropy of the network's evoked responses.
- Same mechanism increases the stimulus discriminability
- Discovery of optimal neuro-stimulation sites

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Hyderabad), Professor Gustavo Deco (UPF Barcelona), and  
Dr. Arpan Banerjee (NBRC, Delhi)



सत्यमेव जयते

Department of Biotechnology  
Govt. of India

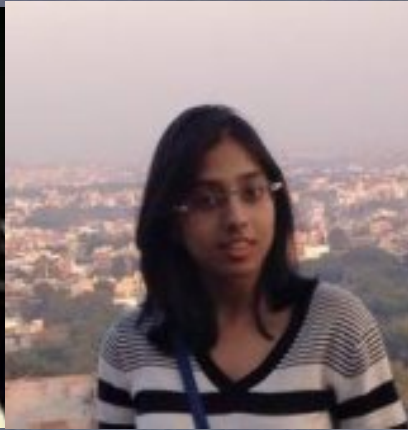


सत्यमेव जयते

Department of Science and Technology  
Government of India



# Contribution by students



Thank you