

Institut de
Neurosciences
des Systèmes

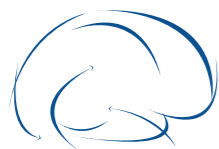


THE VIRTUAL BRAIN

VIKTOR JIRSA



EBRAINS

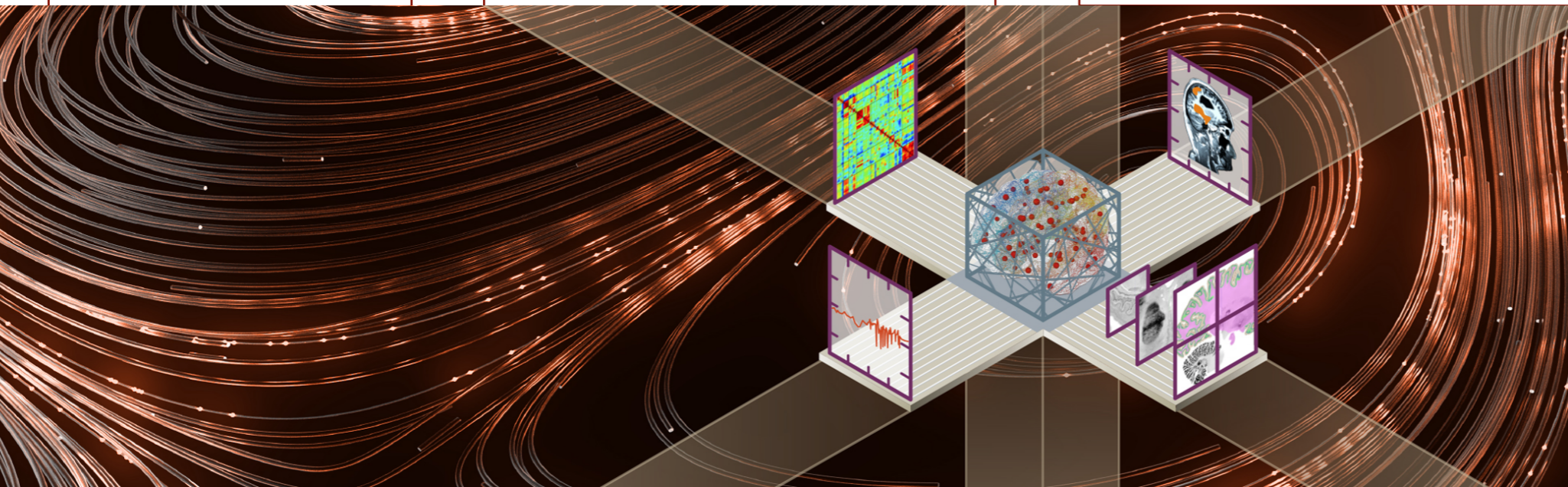
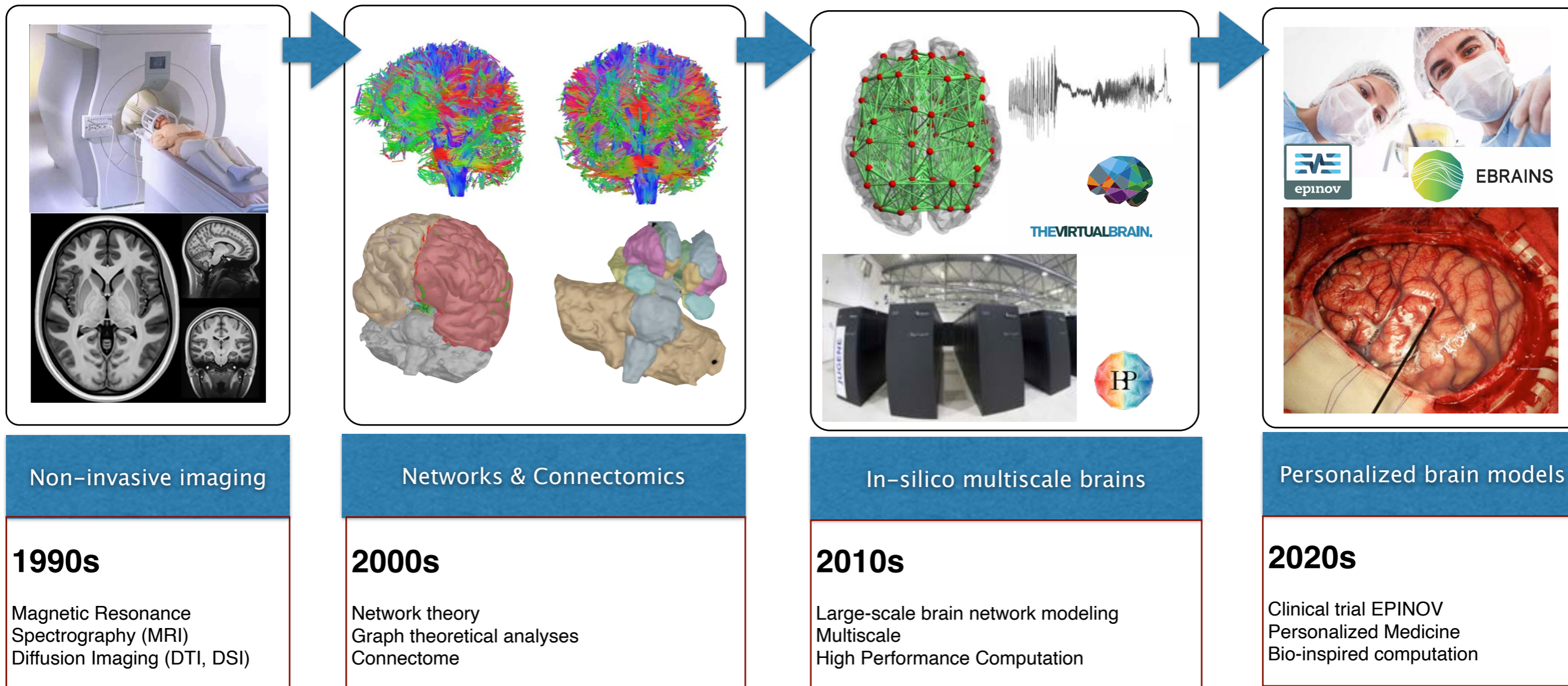


Institut de
Neurosciences
des Systèmes

NETWORKS

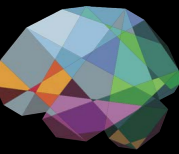
THE VIRTUAL BRAIN

Simulating the Virtual Epileptic Patient (VEP)

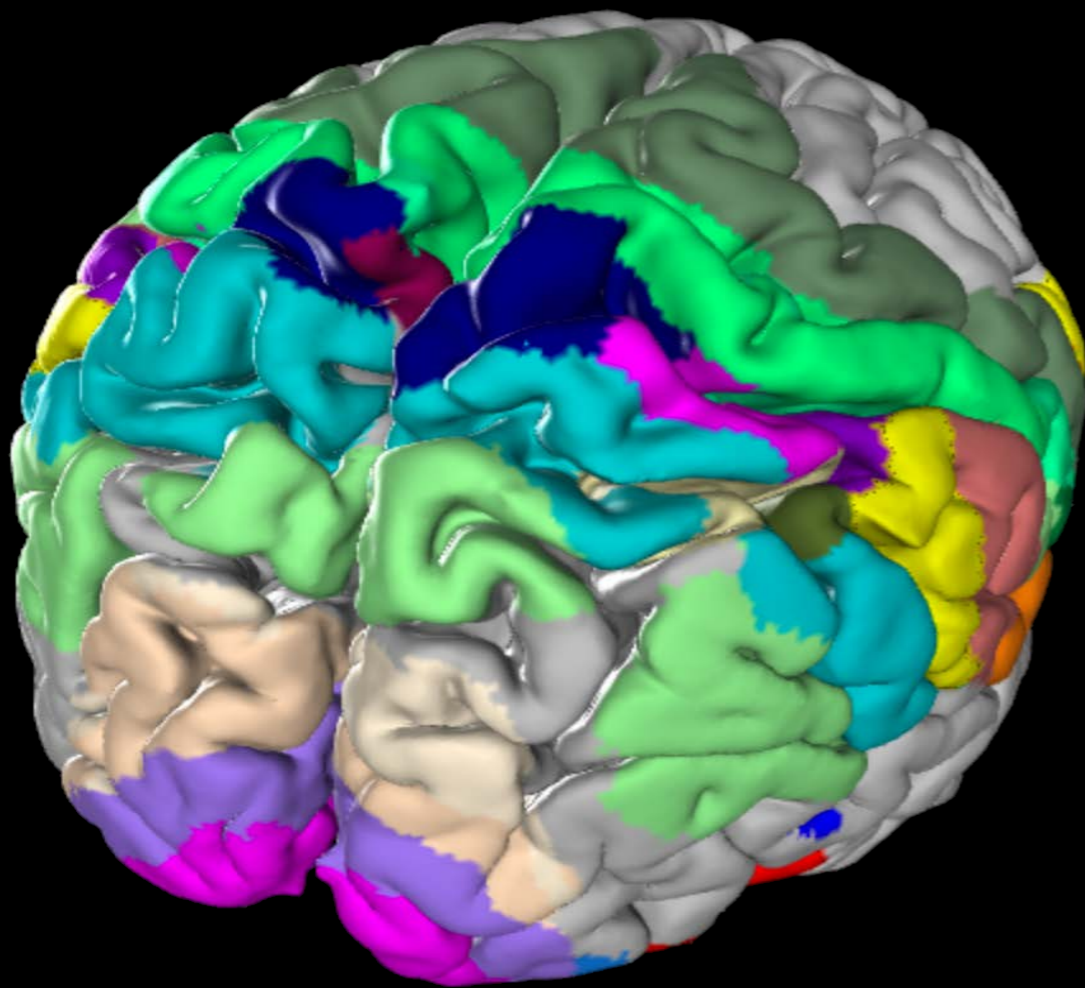




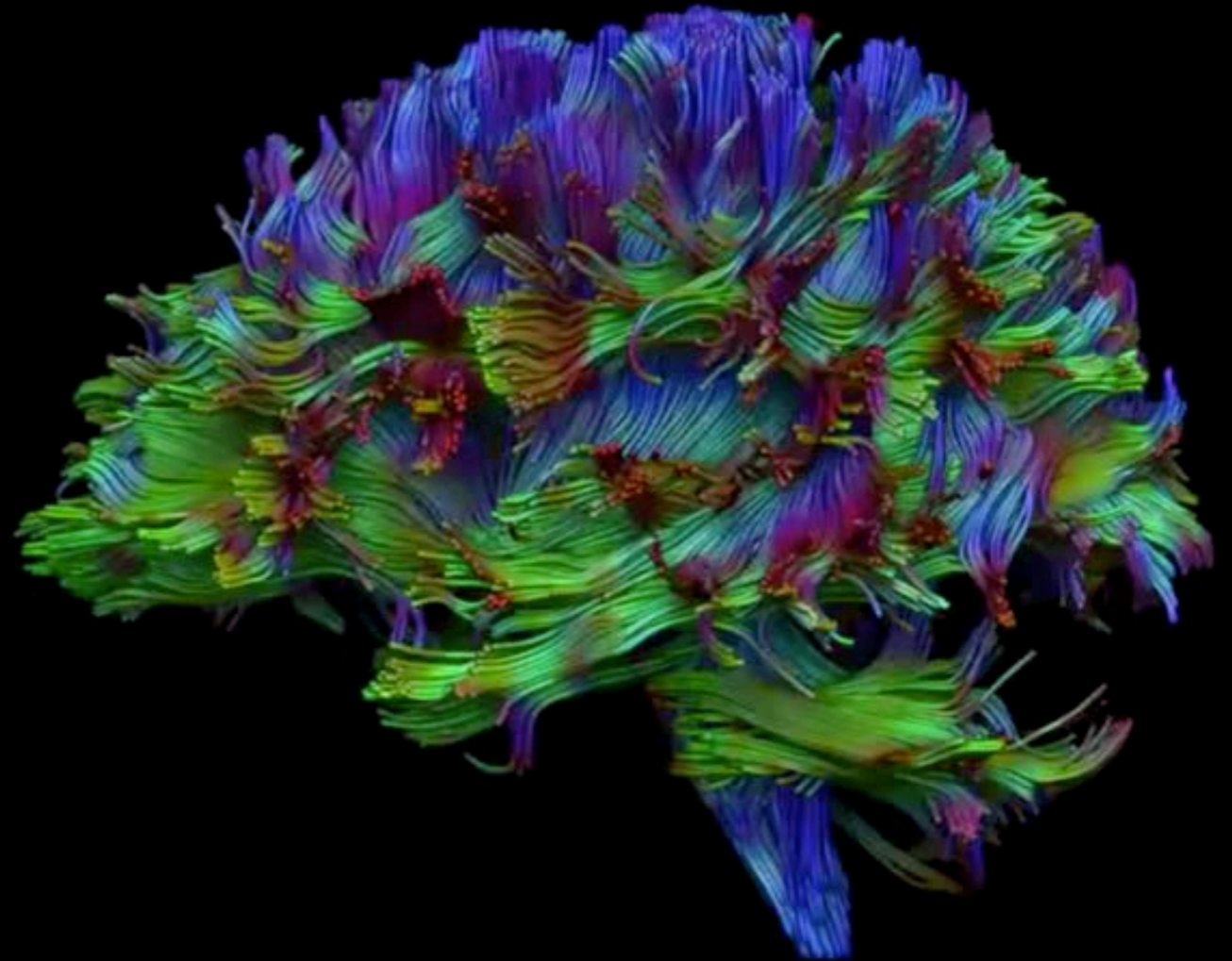
The Virtual Brain (TVB)



Brain structure

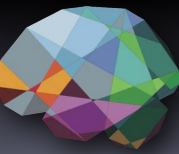


Brain Connectome

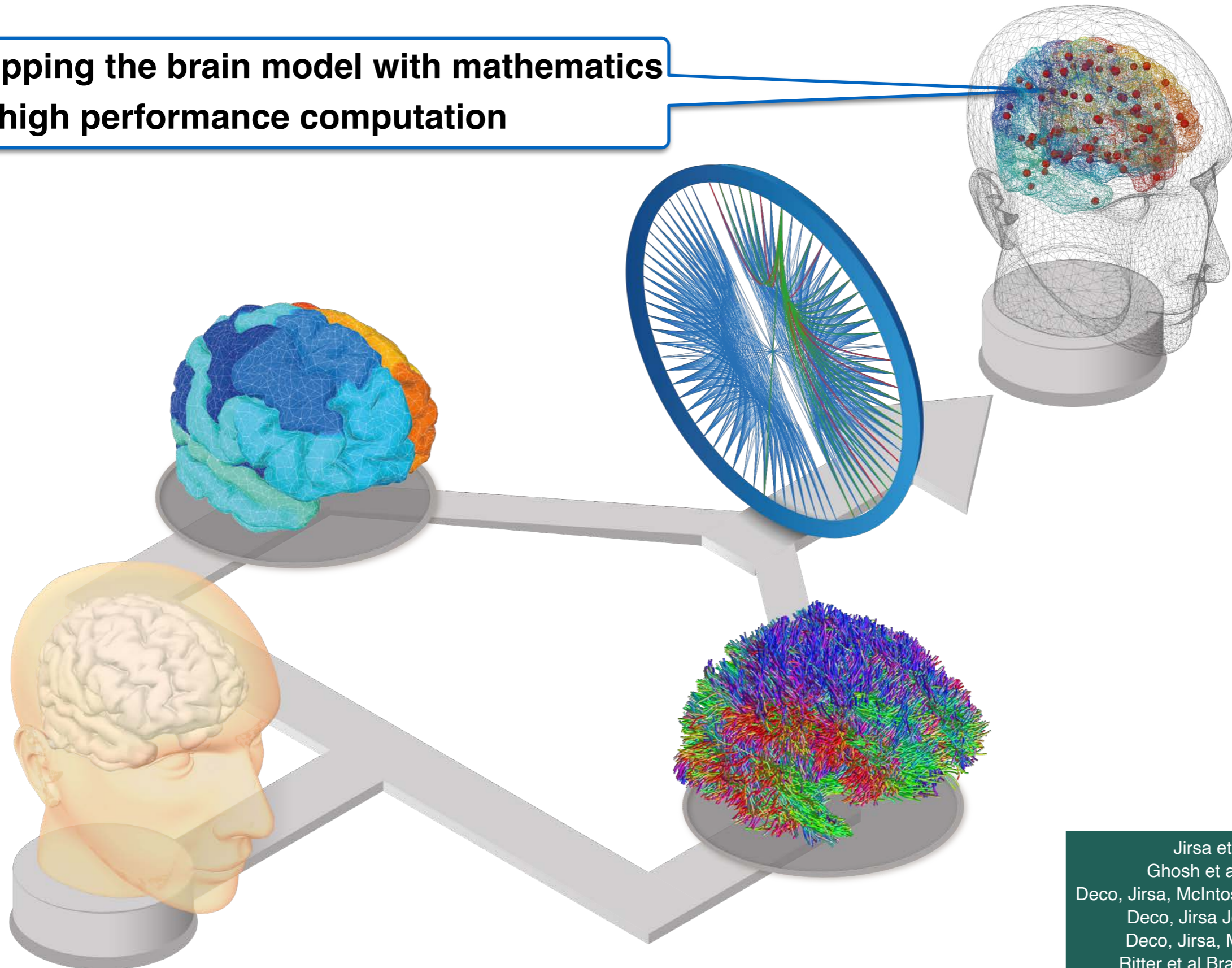




Building The Virtual Brain (TVB)



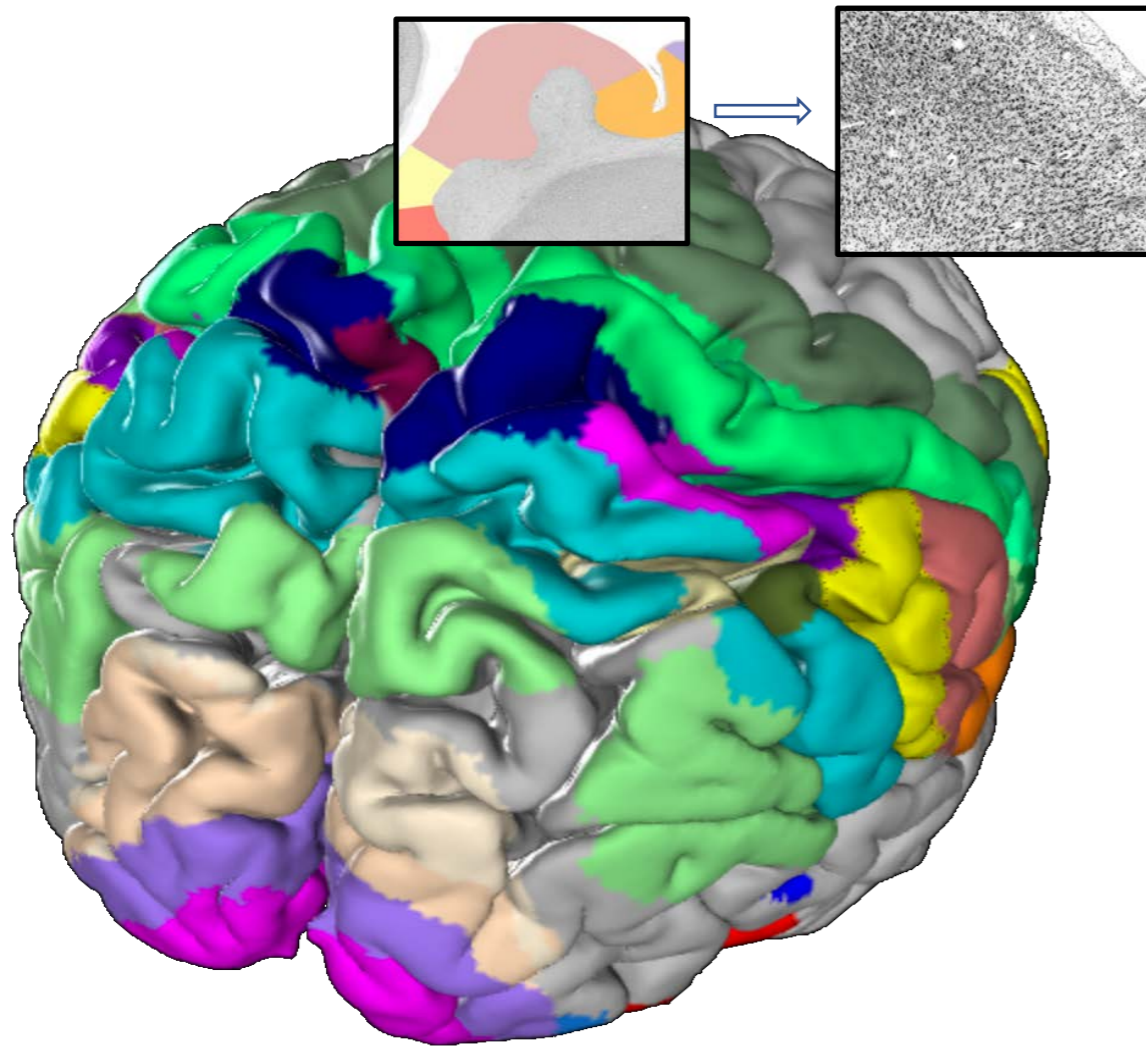
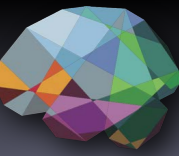
Equipping the brain model with mathematics and high performance computation



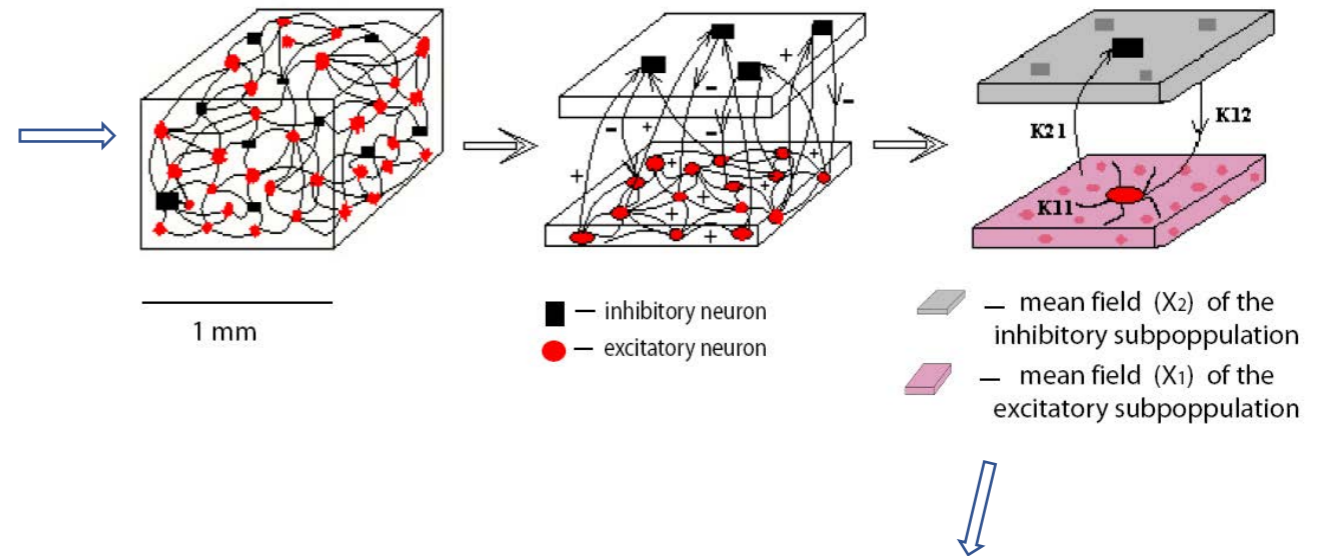
Jirsa et al IEEE 2002
Ghosh et al. PLoS CB 2008
Deco, Jirsa, McIntosh Nat Rev Neurosci 2011
Deco, Jirsa Journ Neurosci 2012
Deco, Jirsa, McIntosh TINS 2013
Ritter et al Brain Connectivity 2013



Building The Virtual Brain (TVB)



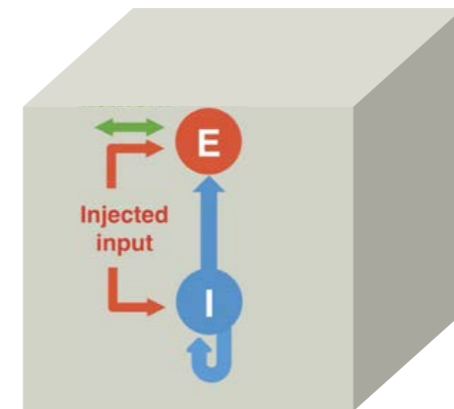
Brain regions



Neural Mass as network node

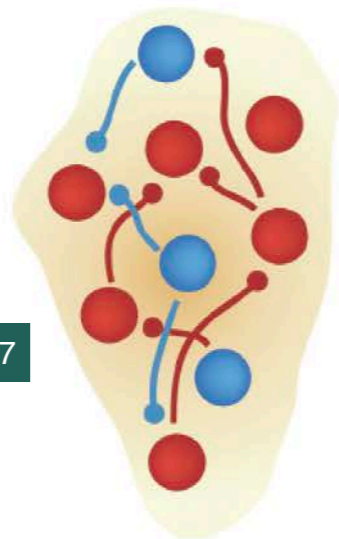
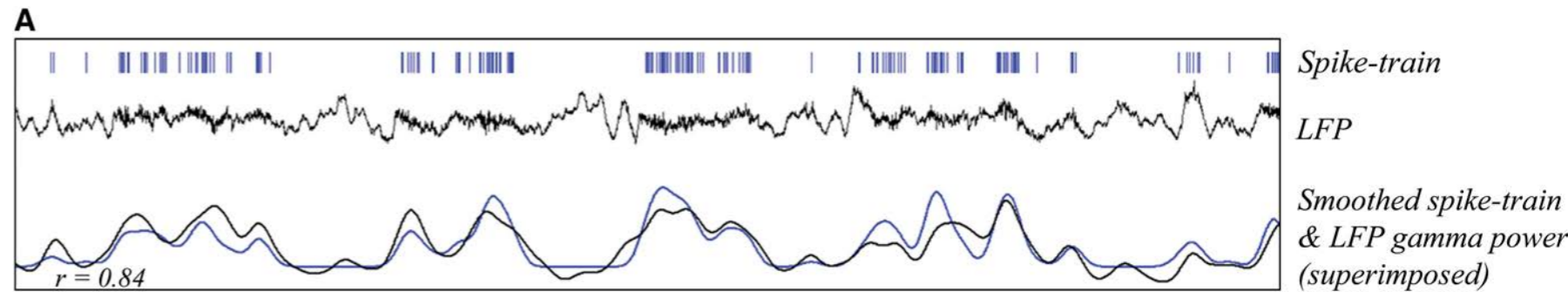
AMPA, NMDA

GABA

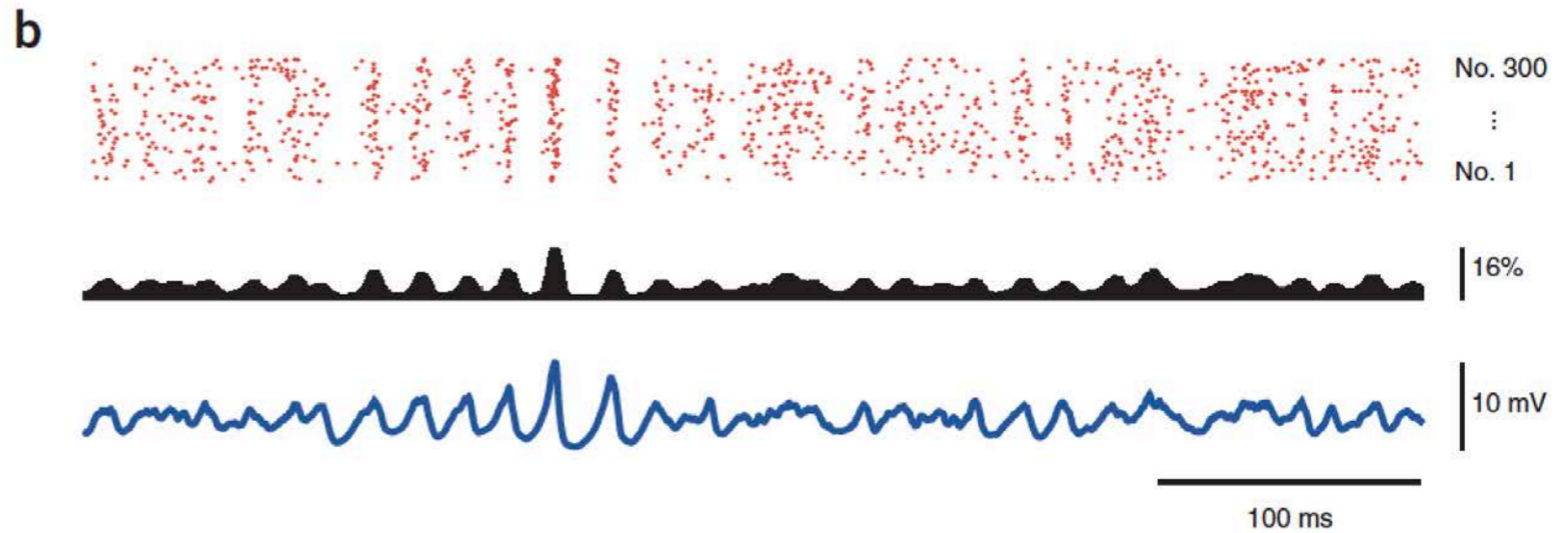


Oscillations in large-scale brain networks

Nir et al Current Biology 2007

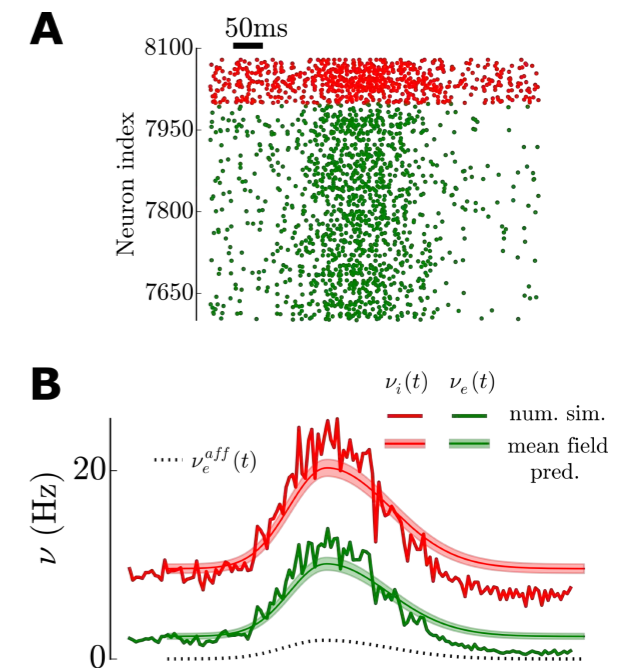
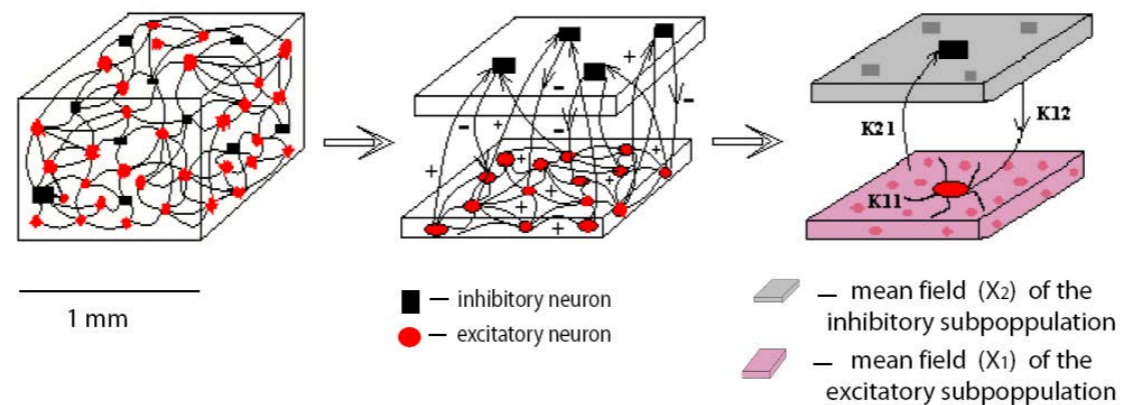


Palmigiano et al. Nat Neurosci 2017

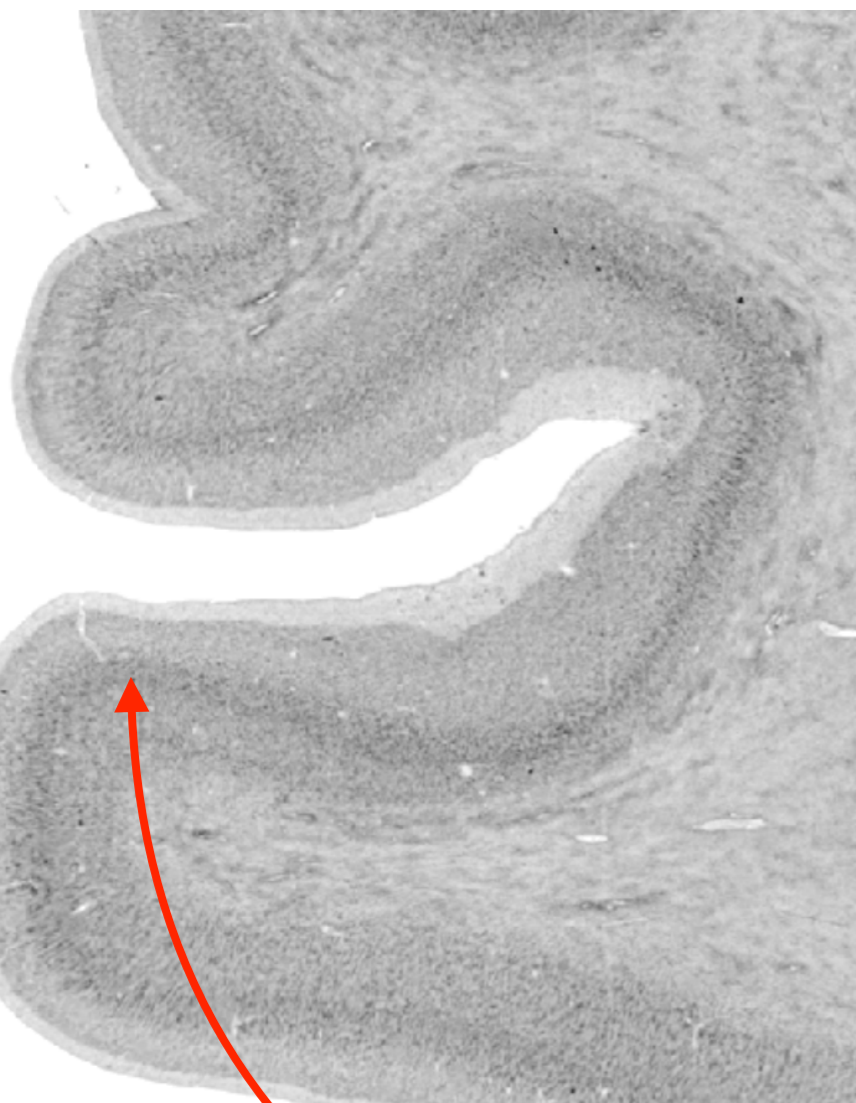


Wendling et al Europ Journ Neurosci 2002
Stefanescu & Jirsa PLoS CB 2008
Zerlaut & Destexhe J Comp Neurosci 2017

Network node: Mean fields

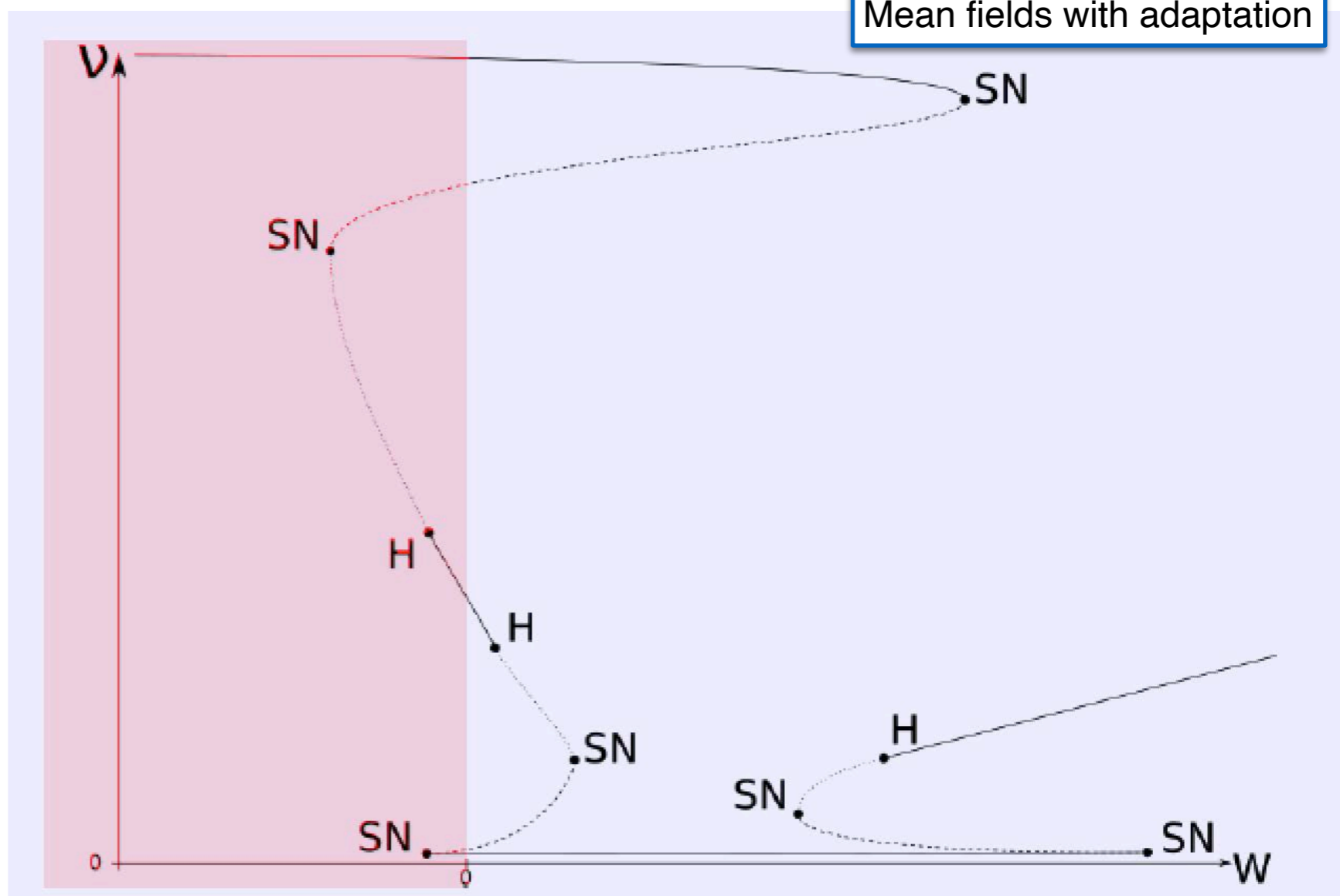


Neural masses through mean fields

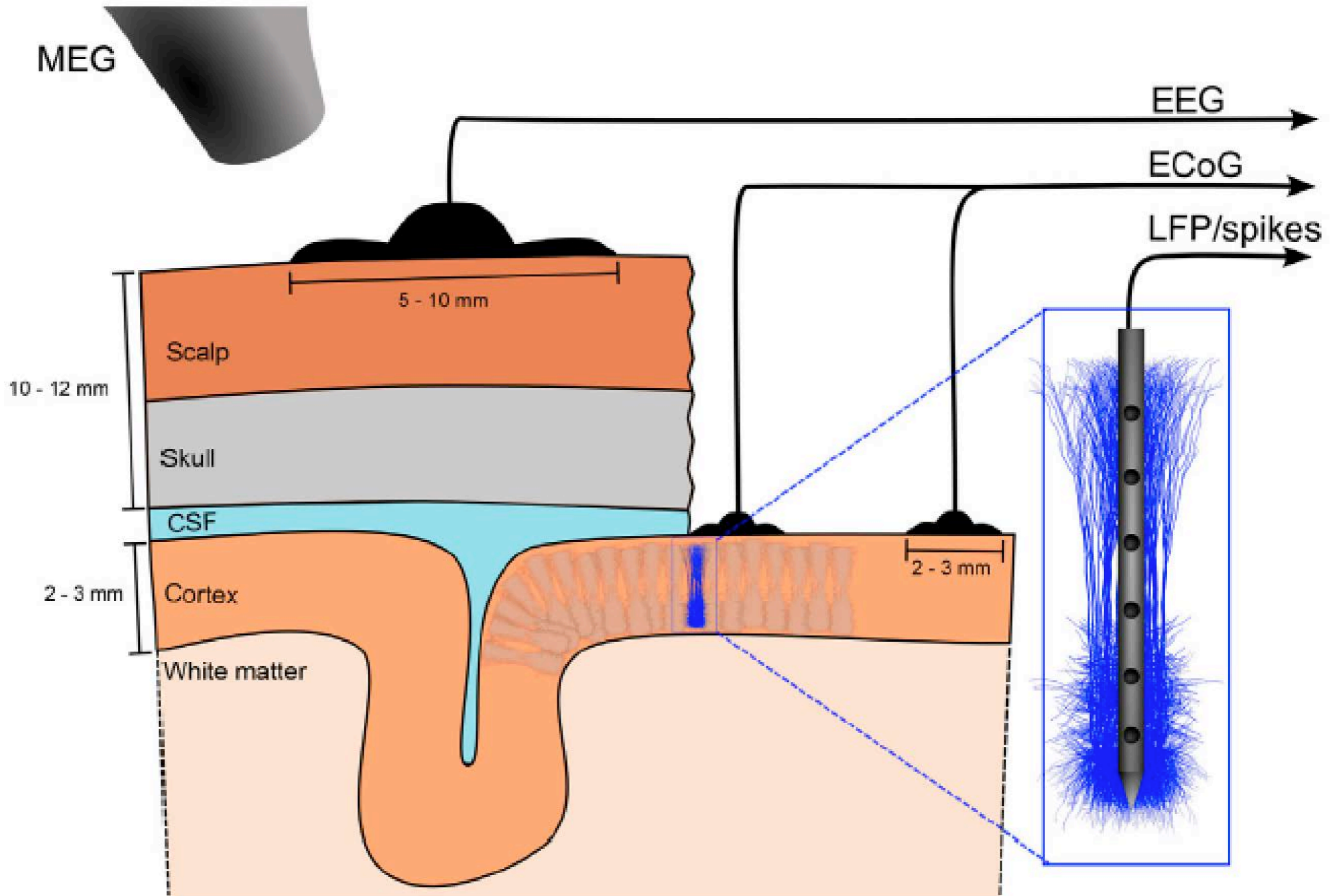


$$\forall \mu, \lambda, \eta \in \{e, i\}^3, \begin{cases} T \frac{\partial v_\mu}{\partial t} = (\mathcal{F}_\mu - v_\mu) + \frac{1}{2} c_{\lambda\eta} \frac{\partial^2 \mathcal{F}_\mu}{\partial v_\lambda \partial v_\eta} \\ T \frac{\partial c_{\lambda\eta}}{\partial t} = A_{\lambda\eta} + (\mathcal{F}_\lambda - v_\lambda) (\mathcal{F}_\eta - v_\eta) + \text{with } A_{\lambda\eta} = \begin{cases} \frac{\mathcal{F}_\lambda (1/T - \mathcal{F}_\lambda)}{N_\lambda} & \text{if } \lambda = \eta \\ 0 & \text{otherwise} \end{cases} \\ c_{\lambda\mu} \frac{\partial \mathcal{F}_\mu}{\partial v_\lambda} + c_{\mu\eta} \frac{\partial \mathcal{F}_\mu}{\partial v_\eta} - 2c_{\lambda\eta} \\ \frac{\partial W}{\partial t} = -\frac{W}{\tau_w} + b * v_e + a * (\mu_V(v_e, v_I, W) - E_L) \end{cases}$$

Mean fields with adaptation



Multiscale virtual brain modeling for network dynamics

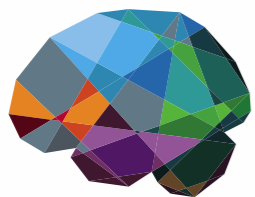
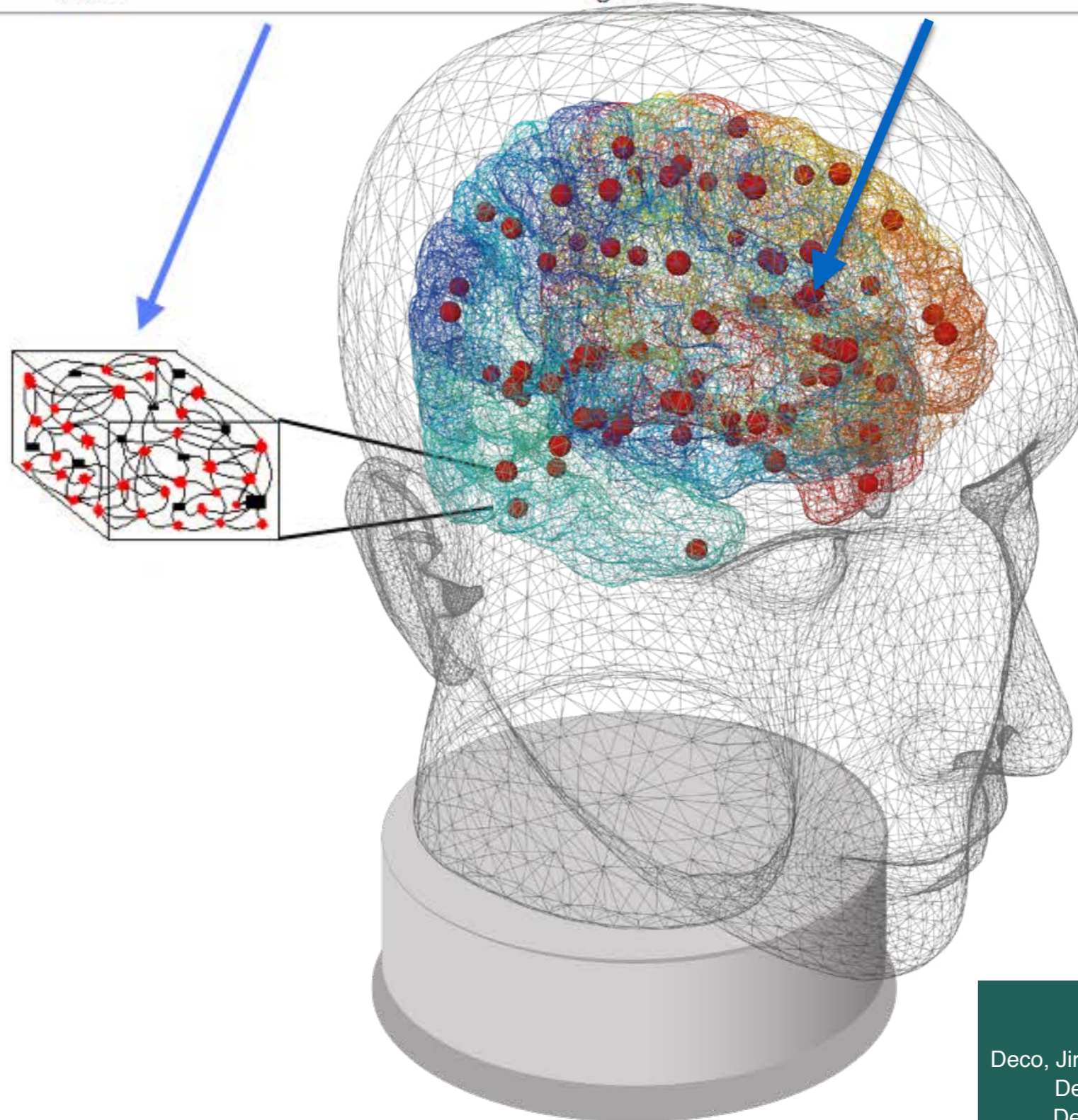




Building personalized large-scale brain networks

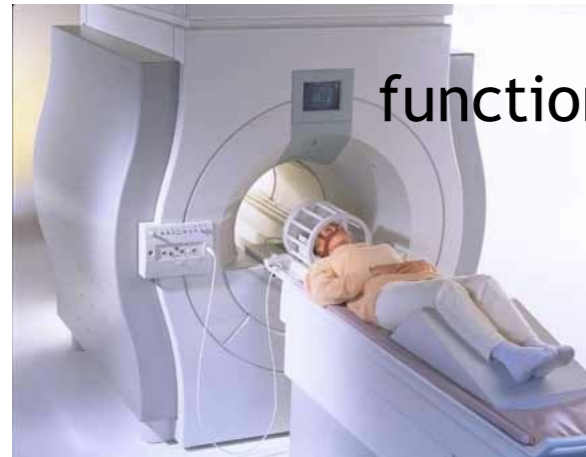
$$\dot{\psi}(x,t) = N(\psi(x,t)) + \int_{local} g(x-x')S(\psi(x',t))dx' + \int_{global} G(x,x')S(\psi(x',t - \frac{|x-x'|}{v}))dx' + \text{noise}$$

Field potential





Concepts: Connectome-based brain networks



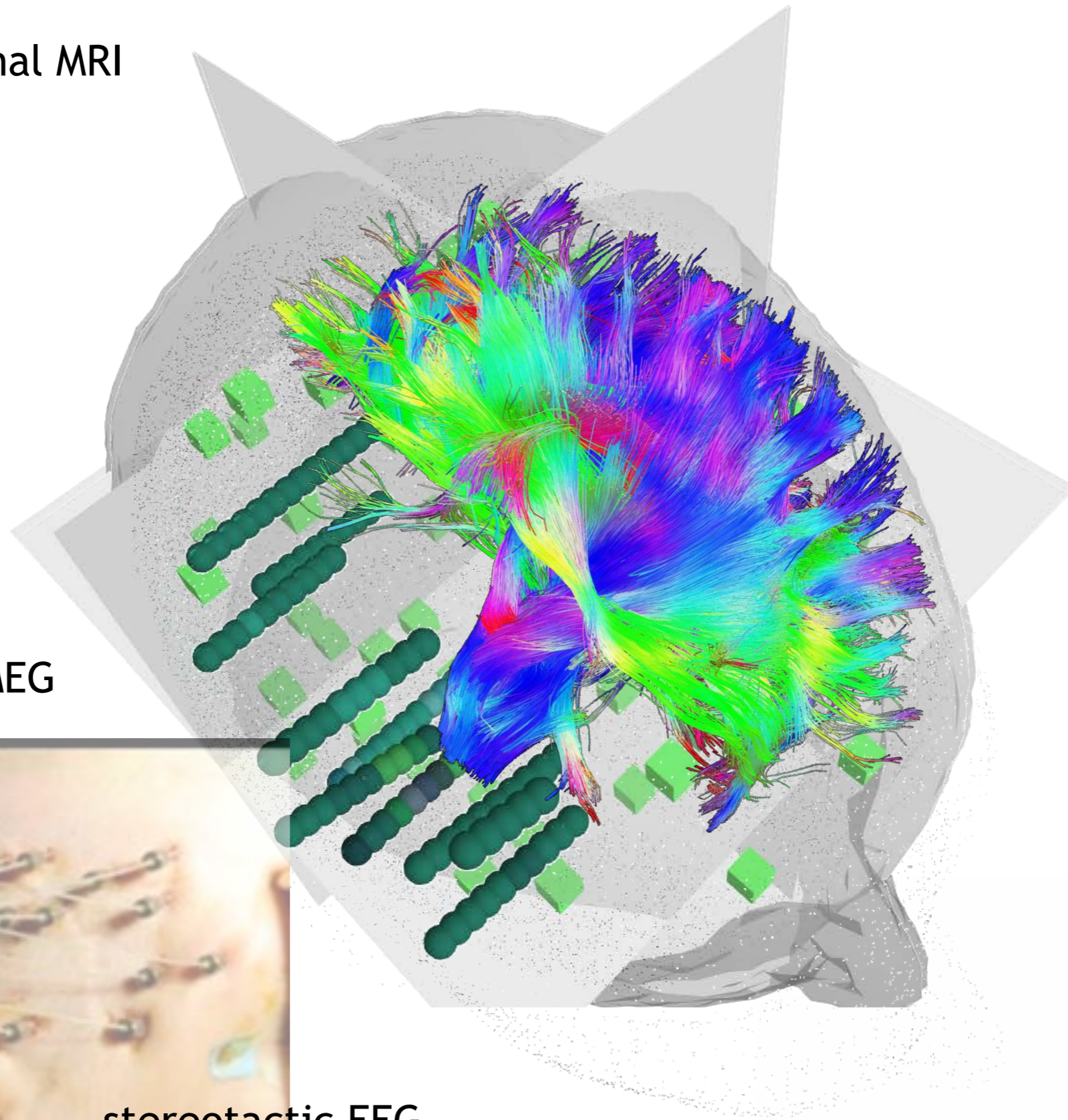
functional MRI



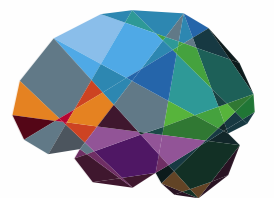
MEG

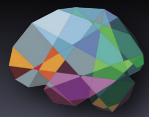


stereotactic EEG



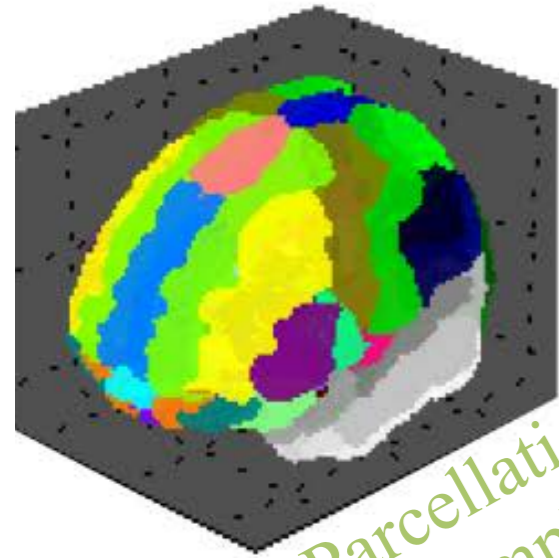
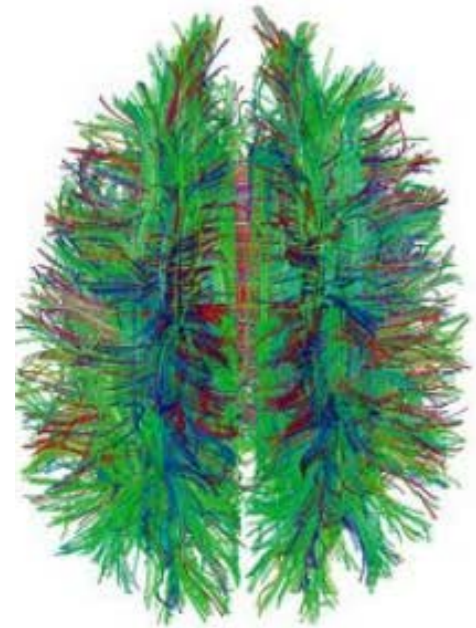
Deco, Jirsa, McIntosh Nature Rev Neurosci 2011





The Virtual Brain (TVB) platform release in 2012

DTI/ Tractography



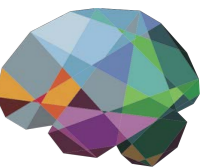
Parcellation
Template

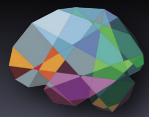
The screenshot displays the TVB software interface, divided into several panels:

- VIEW: Large Scale Connectivity:** Shows a 3D brain model with colored nodes and edges representing connectivity.
- CONTROL: Large Scale Matrices:** A large connectivity matrix (heatmap) with rows and columns labeled with brain regions (e.g., IA1, IA2, AMYG, etc.). A color scale on the right ranges from 0.000 to 3.000.
- Simulator:** A central panel for configuring simulation parameters, including:
 - Long-range connectivity:** Connectivity - conn_74 - John Doe - From: cfl_74 - ID: 1
 - Long-range coupling function:** Linear
 - Conduction Speed:** 3.0
 - Cortical surface:** None
 - Spatiotemporal stimulus:** None
 - Local dynamic model:** Generic 2d Oscillator
 - Parameters:** τ [1.0], I_{ext} [0.0], a [-2.0], b [-10.0], c [0.0], e [3.0]
- Time Series:** A plot showing signal over time (000 to 680) for regions like PFCOL, PFC, and M1.
- Connectivity 2D Viewer:** A network graph showing connections between brain regions.
- Brain Viewer:** A 3D brain model with a color scale on the right ranging from -8.96 to 8.55.

Jirsa et al IEEE 2002
 Ghosh et al. PLoS CB 2008
 Deco, Jirsa, McIntosh Nat Rev Neurosci 2011
 Deco, Jirsa Journ Neurosci 2012
 Deco, Jirsa, McIntosh TINS 2013
 Ritter et al Brain Connectivity 2013

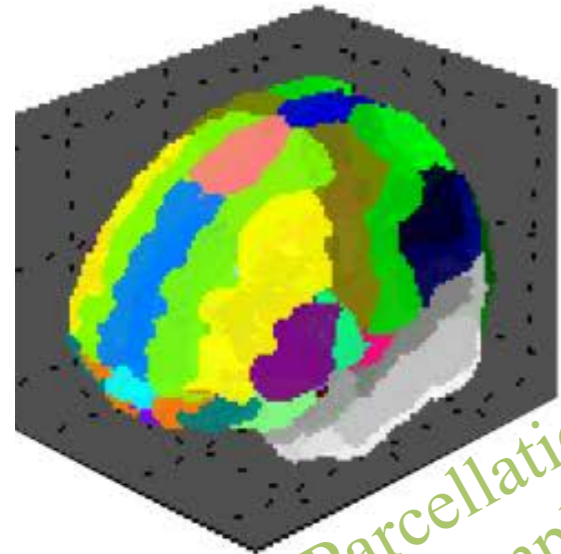
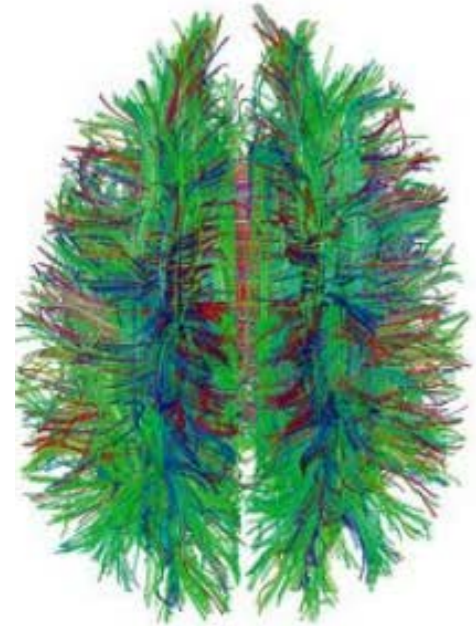
Sanz Leon et al Front Neuroinformatics 2013; Neuroimage 2015





The Virtual Brain (TVB) platform release in 2012

DTI/ Tractography



Parcellation
Template



Jirsa et al IEEE 2002
 Ghosh et al. PLoS CB 2008
 Deco, Jirsa, McIntosh Nat Rev Neurosci 2011
 Deco, Jirsa Journ Neurosci 2012
 Deco, Jirsa, McIntosh TINS 2013
 Ritter et al Brain Connectivity 2013

Sanz Leon et al Front Neuroinformatics 2013; Neuroimage 2015



The Virtual Mouse Brain (TVMB)

Local dynamics

Global dynamics

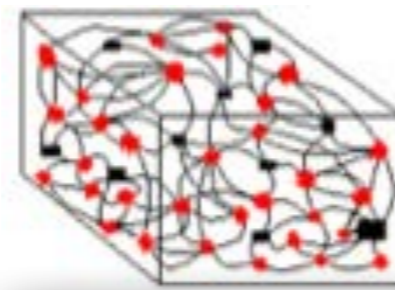
$$\psi(x,t) = N(\psi(x,t)) + \int_{local} g(x-x')S(\psi(x',t))dx' + \int_{global} G(x,x')S(\psi(x',t - \frac{|x-x'|}{v}))dx' + noise$$

Field potential

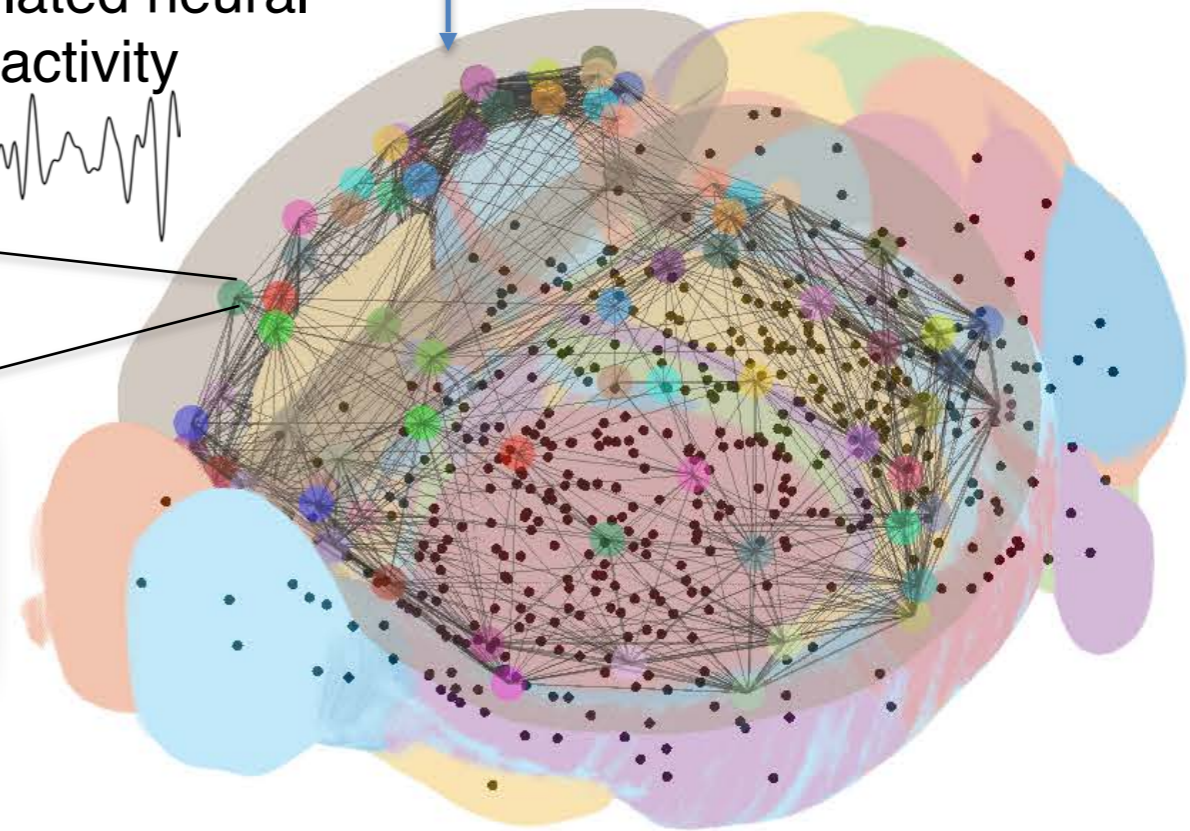
Intrinsic activity

0.1-1mm

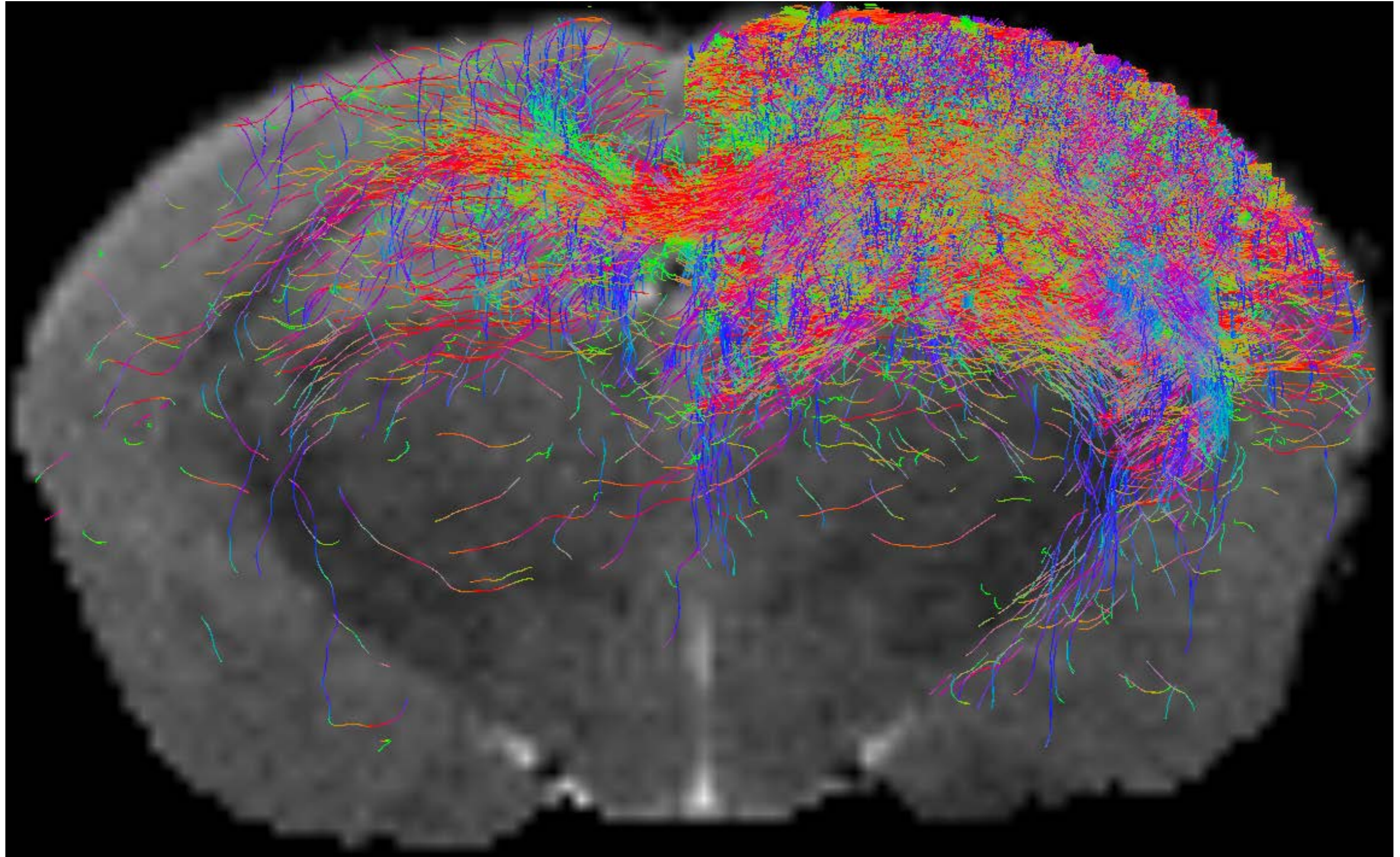
Simulated neural activity



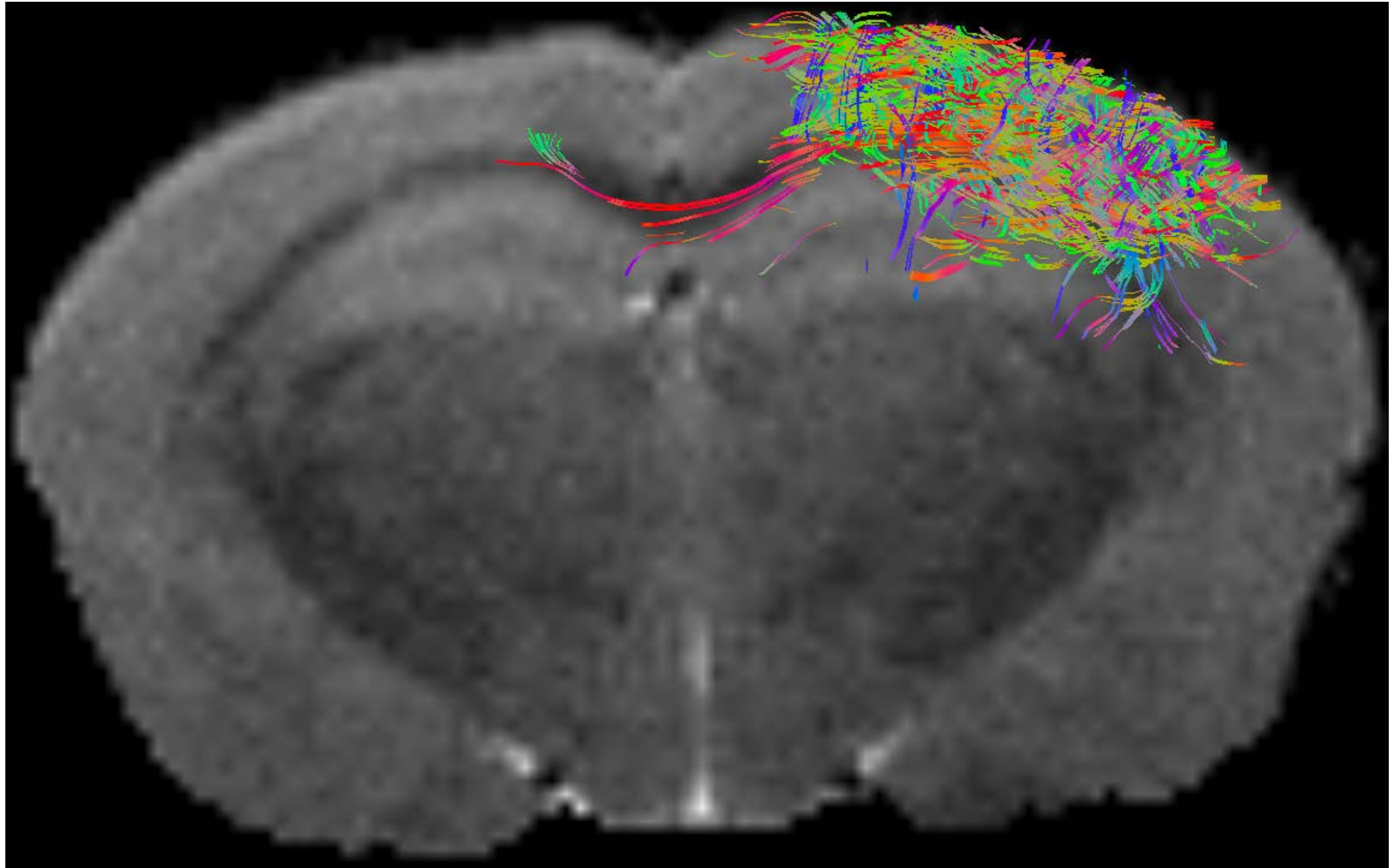
Neuronal mean field



Probabilistic Tractography



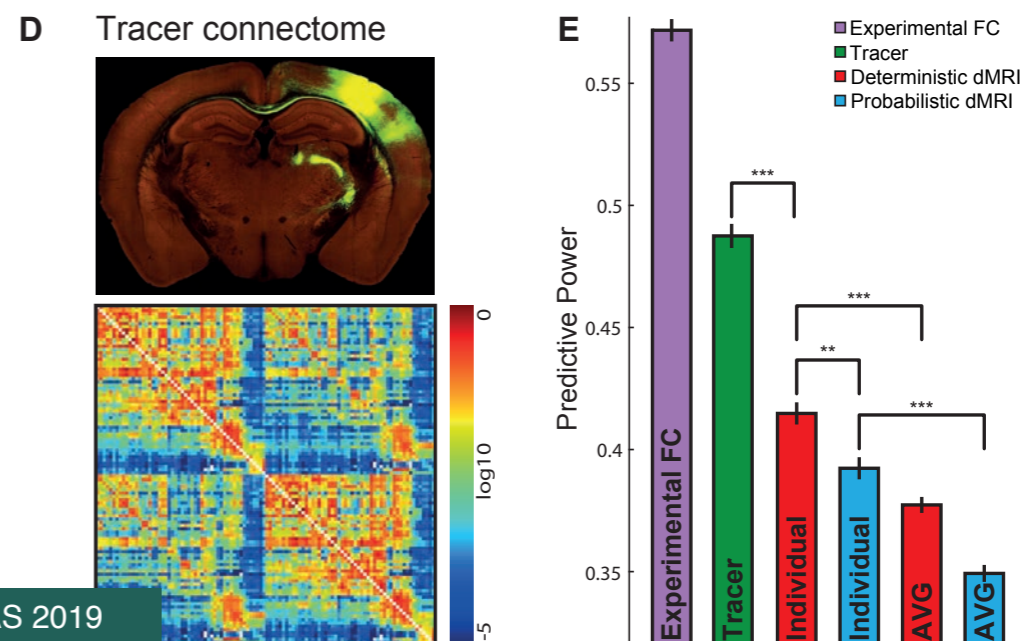
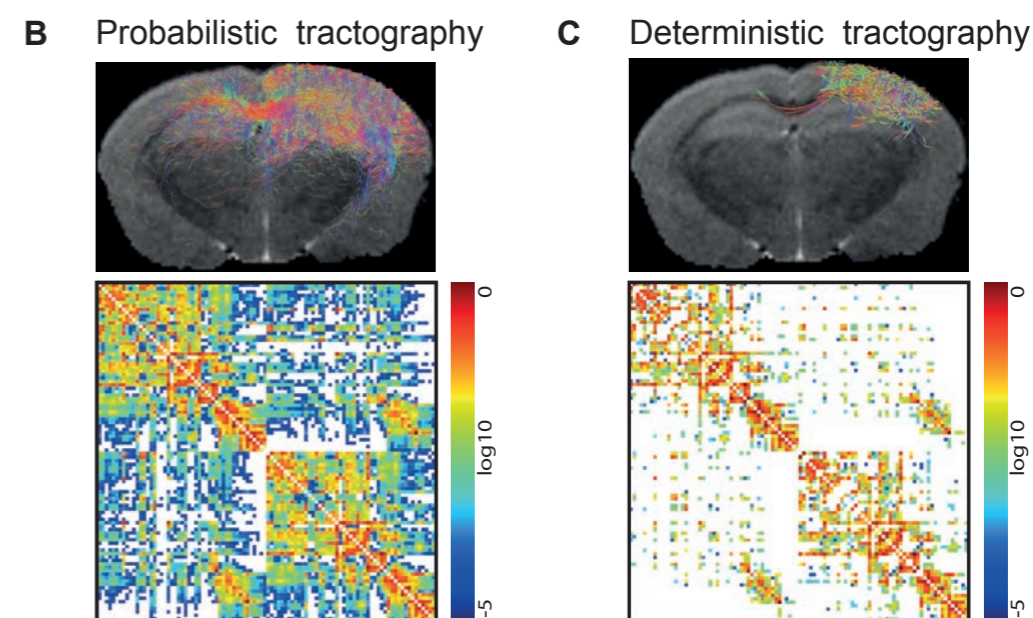
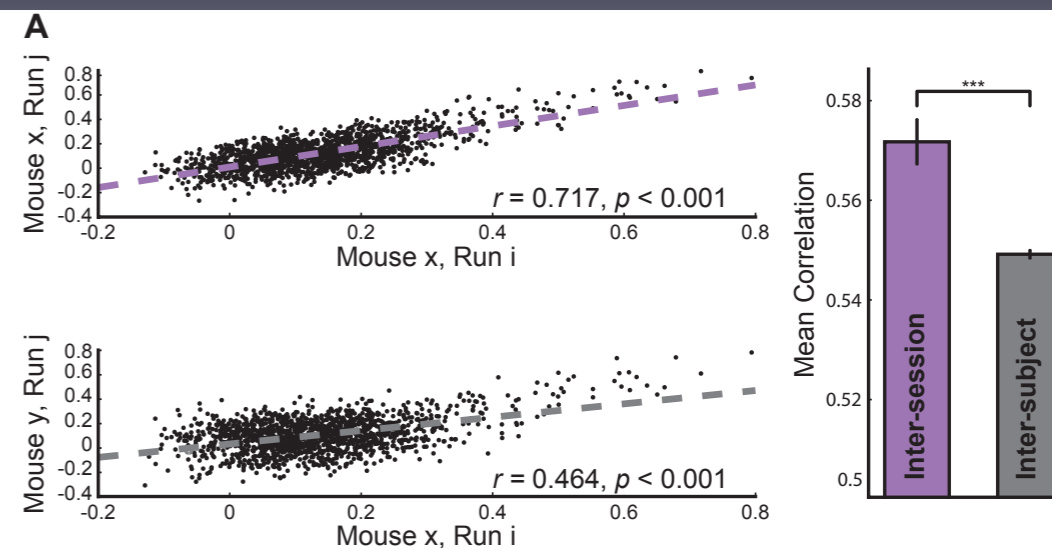
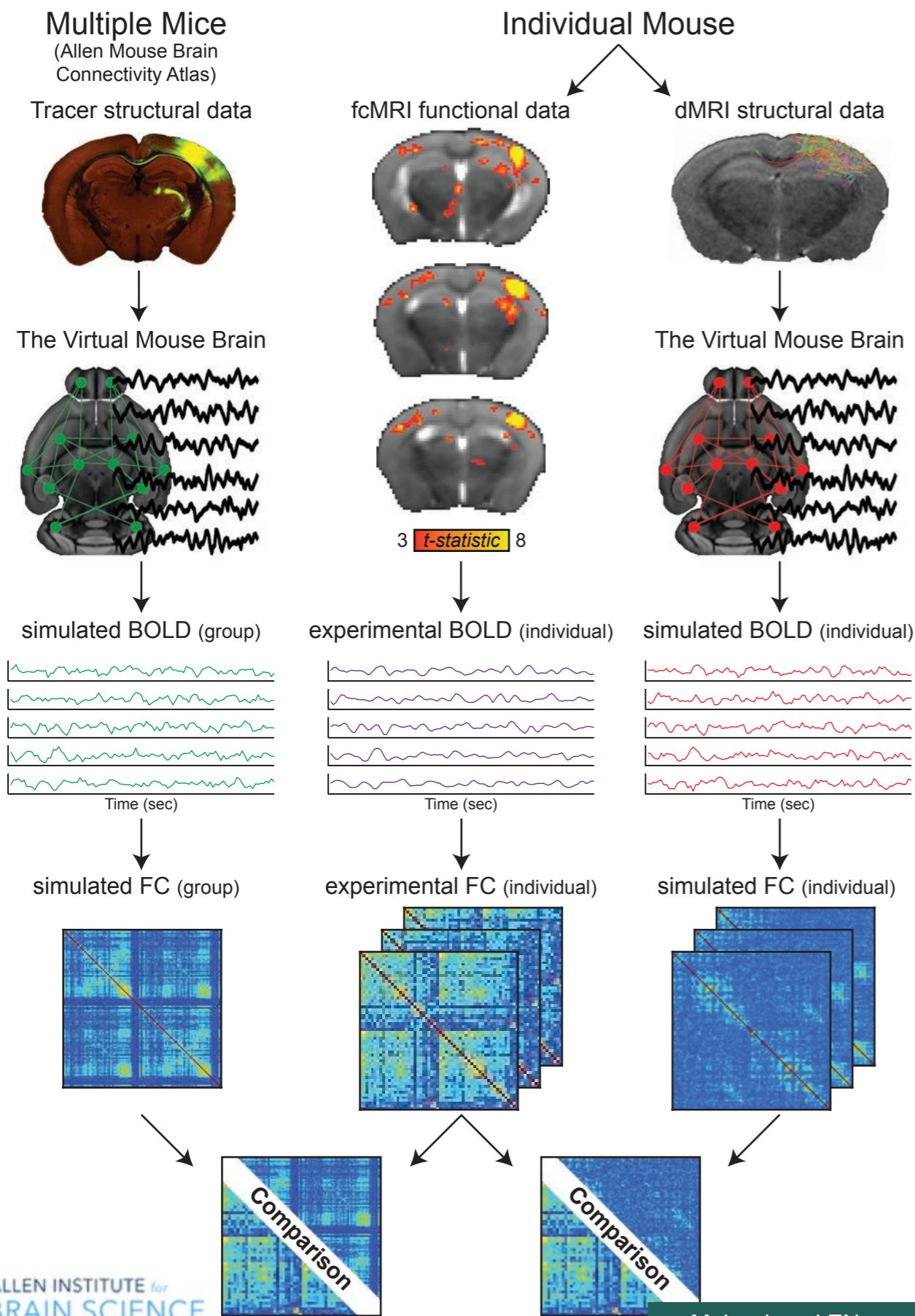
Deterministic Tractography



Allen Atlas



The Virtual Mouse Brain (TVMB) modeling - validation

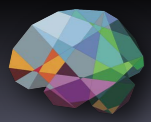




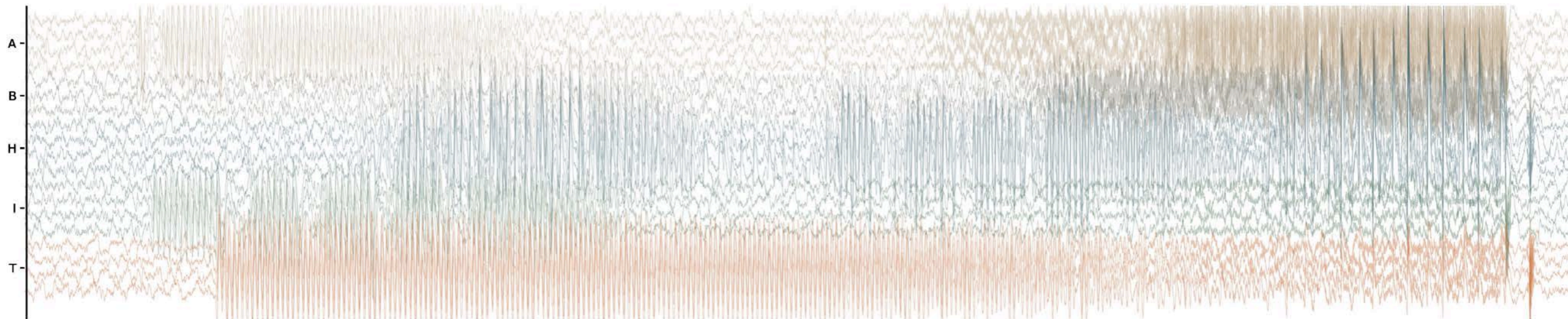
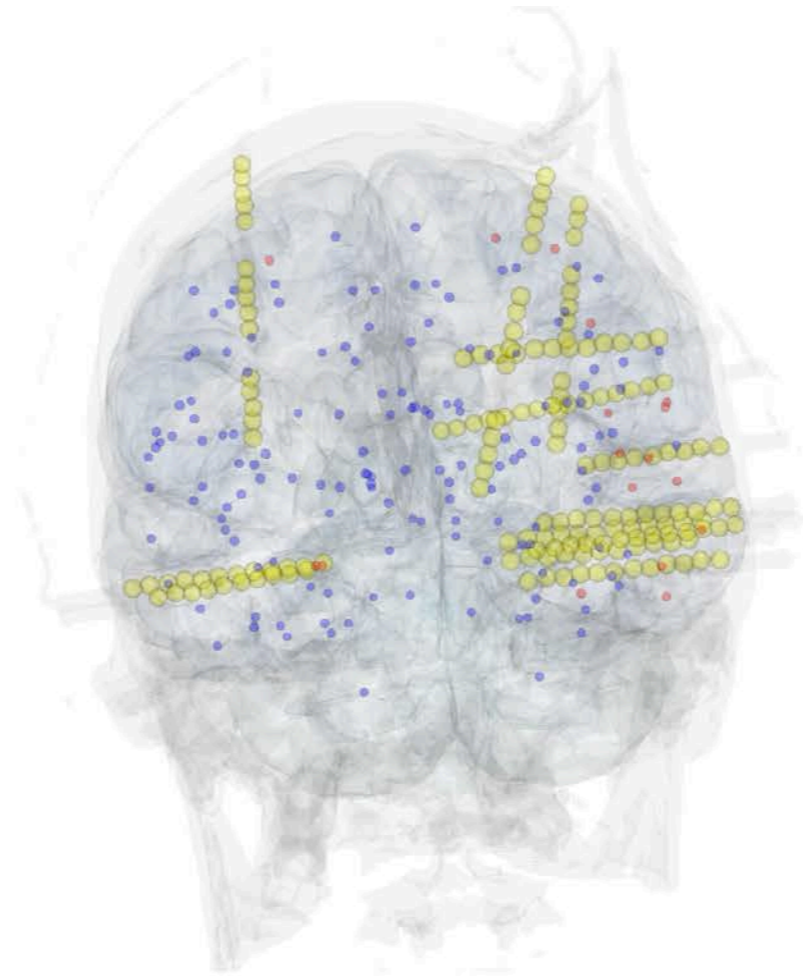
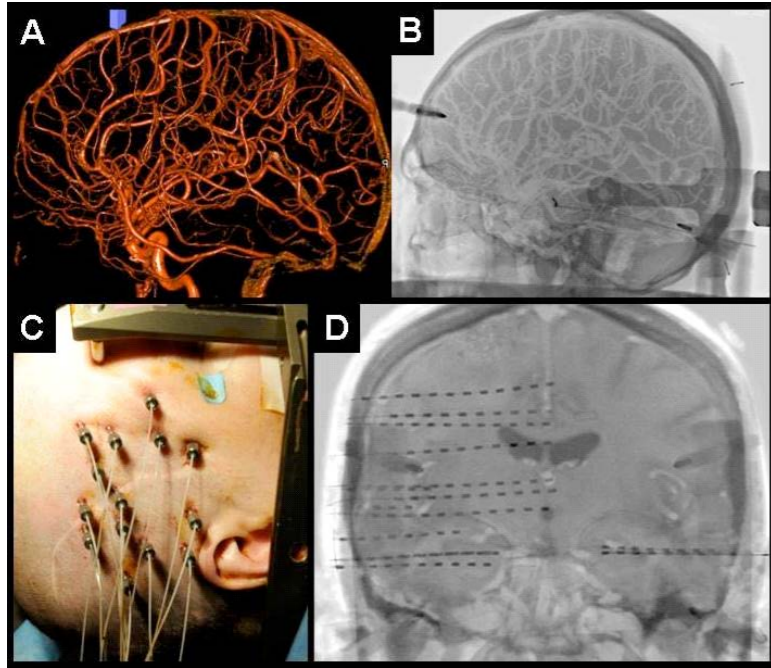
Institut de
Neurosciences
des Systèmes

TRANSLATION

APPLICATIONS IN EPILEPSY

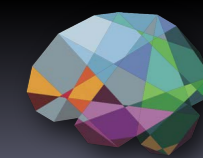


Simulation: Complex seizure



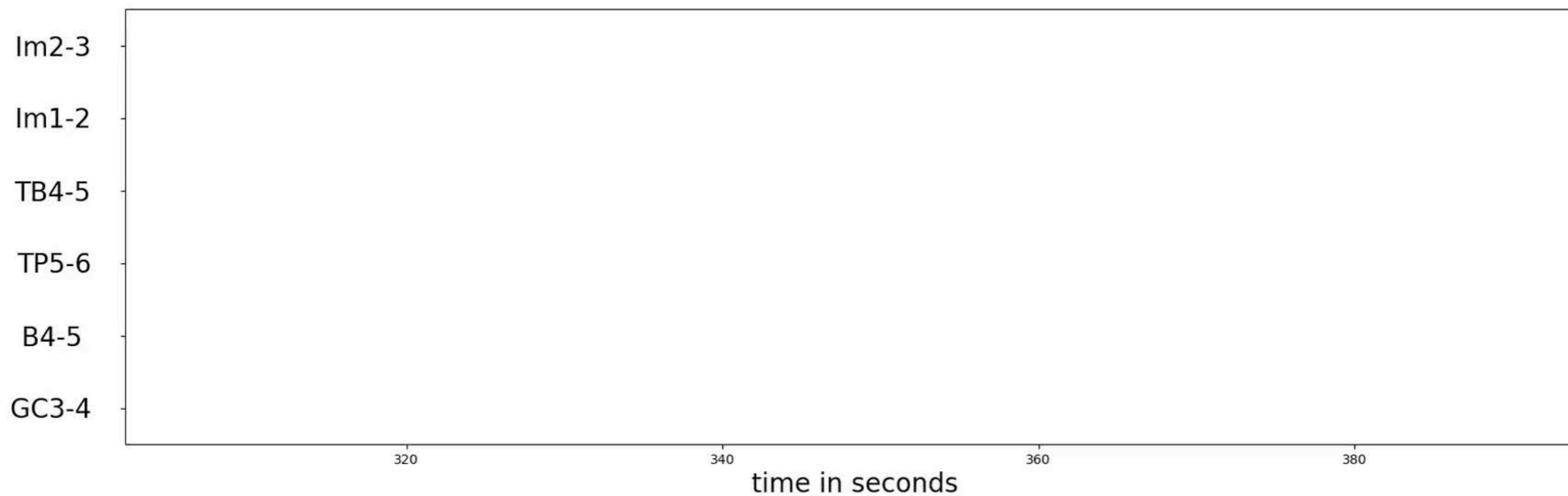
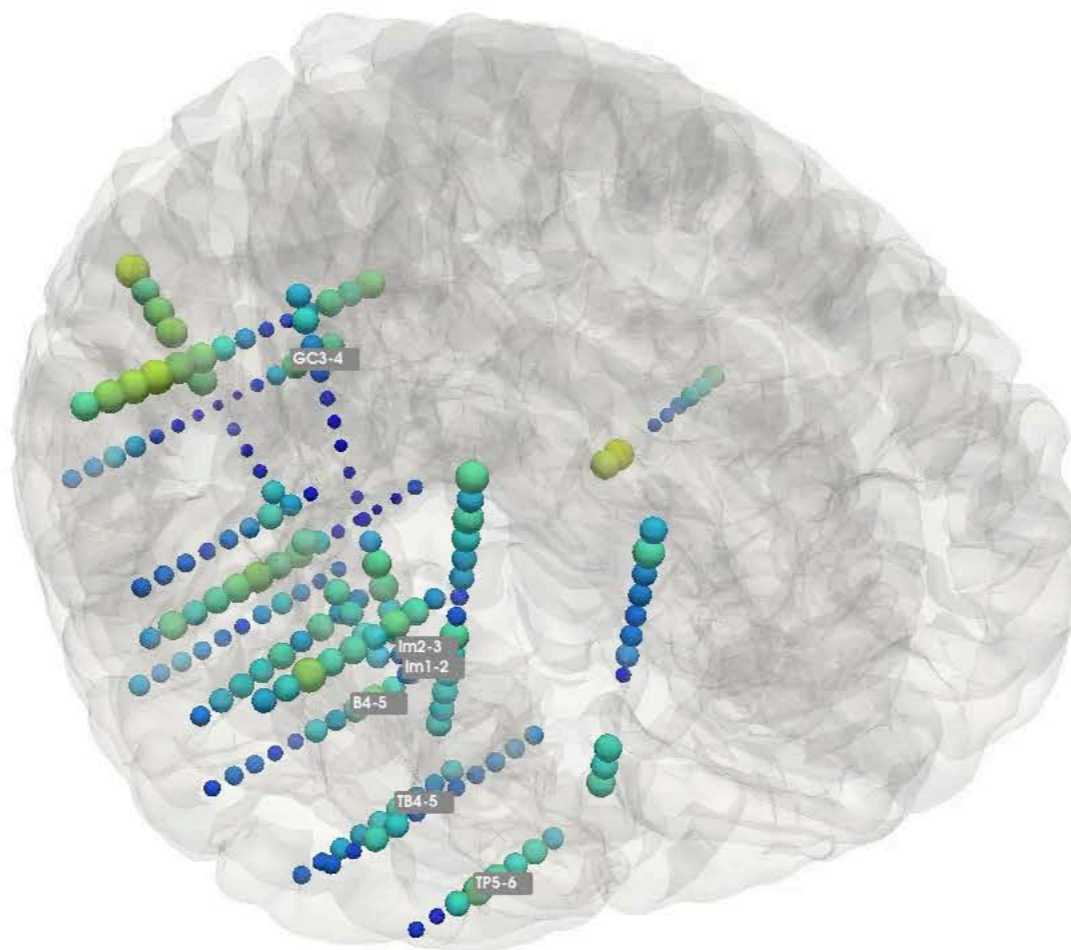


Simulating the Virtual Epileptic Patient (VEP)



EBRAINS

Sensor level





Epilepsy surgery guided by VEP



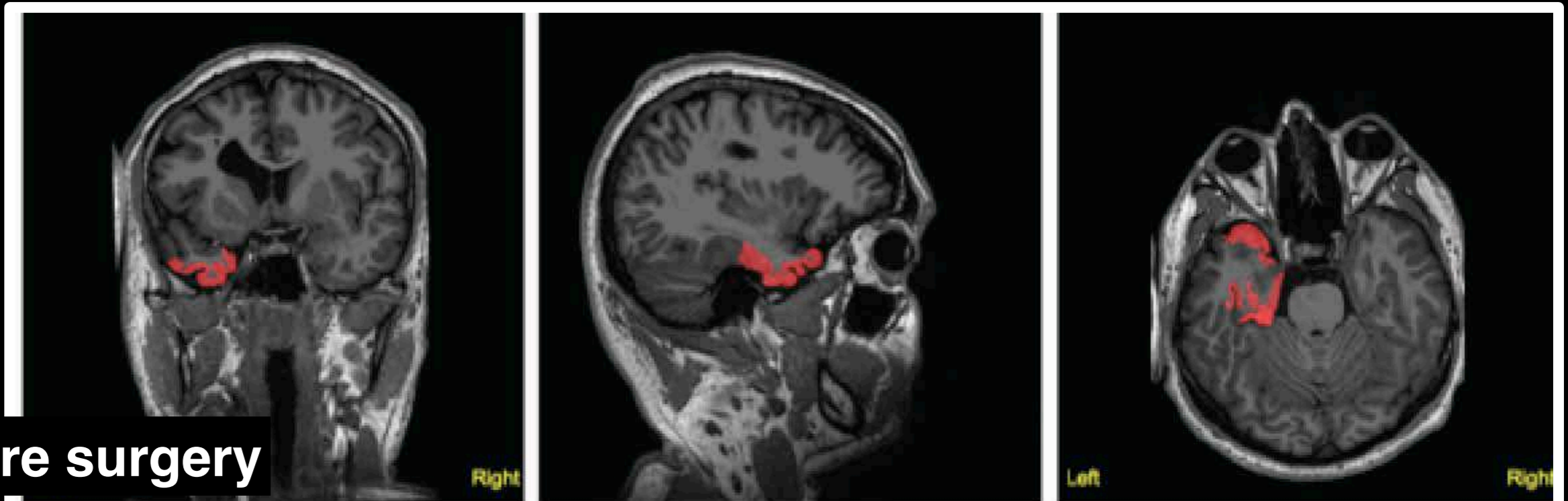
epinov

UN PROJET RHU

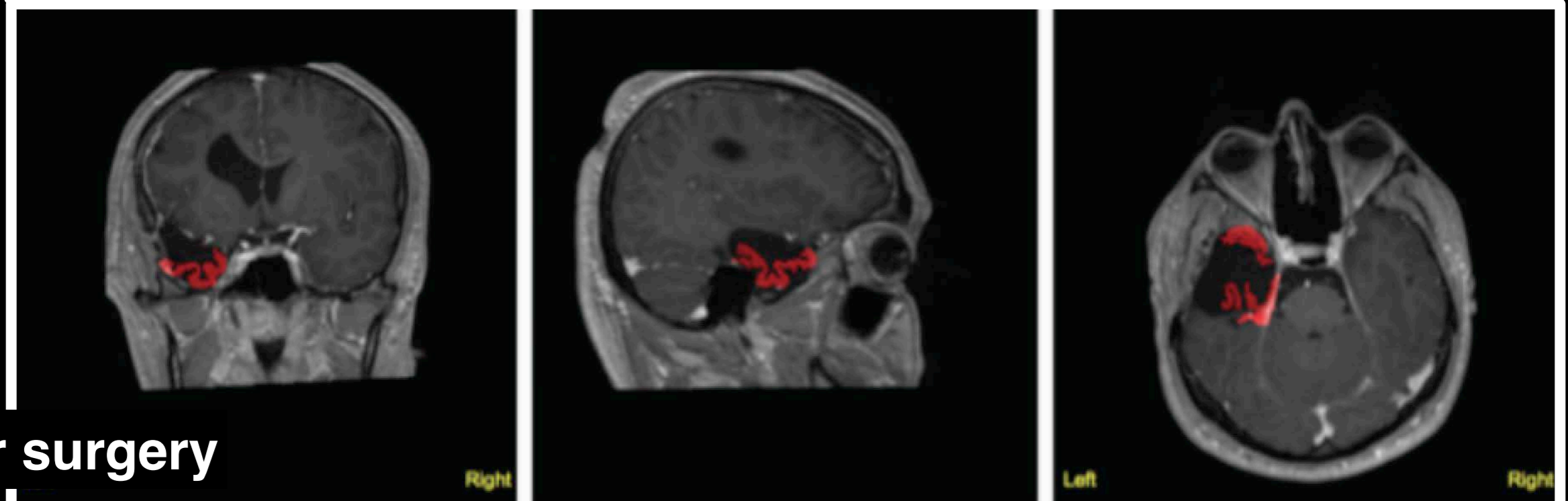
« Brain surgery is a very personal matter... »

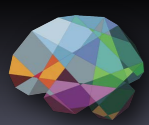
VEP Clinical trial 2019 - 2022: 400 prospective patients

Before surgery

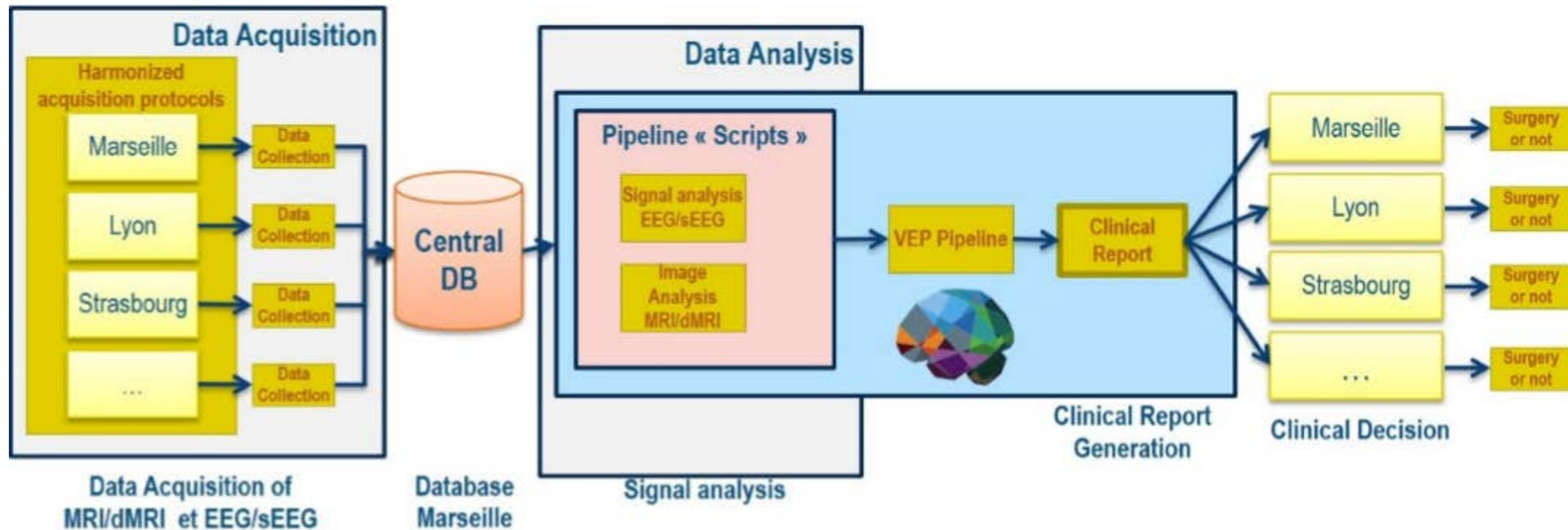


After surgery





VEP: Prospective validation in clinical trial (400 patients, 2019-2022)



Clinical trial:
 randomized parallel-group study trial
 (Coordinator F. Bartolomei; Scientific Director V. Jirsa)

Objective:
 evaluate the role of personalized **Virtual Epileptic Patient brain models**
 for surgery planning and outcome

13 French clinical centers
 400 prospective patients during 2019 - 2022





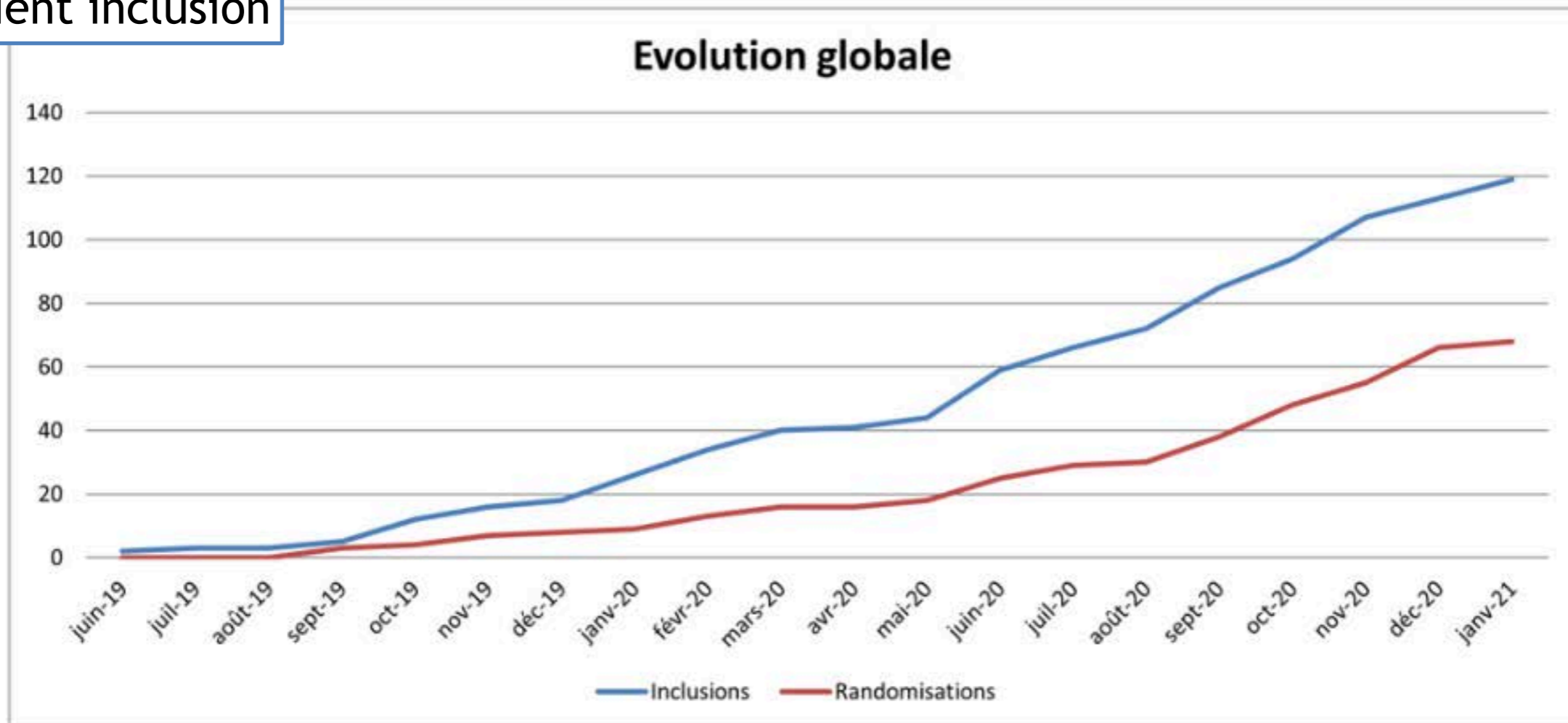
State of the art

Clinical trial EPINOV ongoing in France

(13 epilepsy centers, 400 prospective patients in total)

02/2021: 128 patients included, data of 75 have been randomized

Patient inclusion



VEP performance parameters

VEP was tested against clinical gold standard in cohort of 50 patients

Precision: 0.65

Recall: 0.75

AUC: 0.89

VEP was tested against surgery outcome in cohort of 50 retrospective patients ** $p < 0.05$

Mann-Whitney U-test

Nature of misclassifications

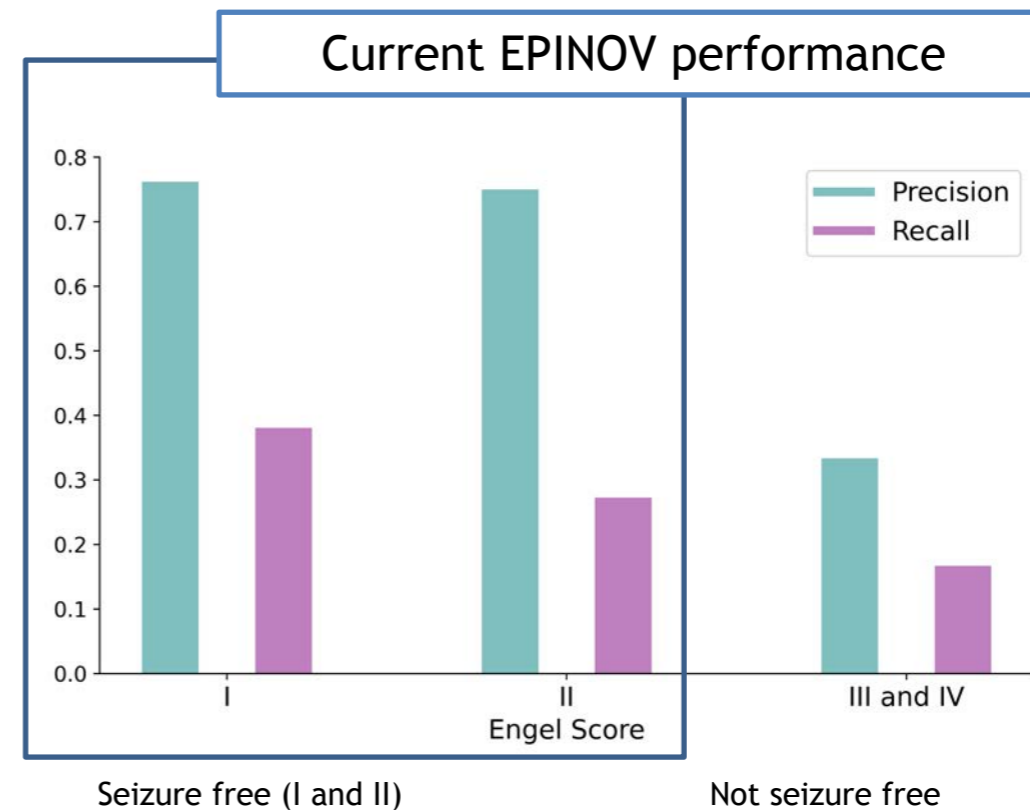
Physiological rhythms mimic seizures

Propagation network identified

Variability in seizure classes

Variability in clinical hypothesis

**Engel score:
Convergence with VEP correlates with
better postsurgical outcome**

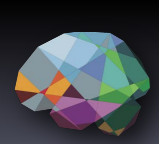




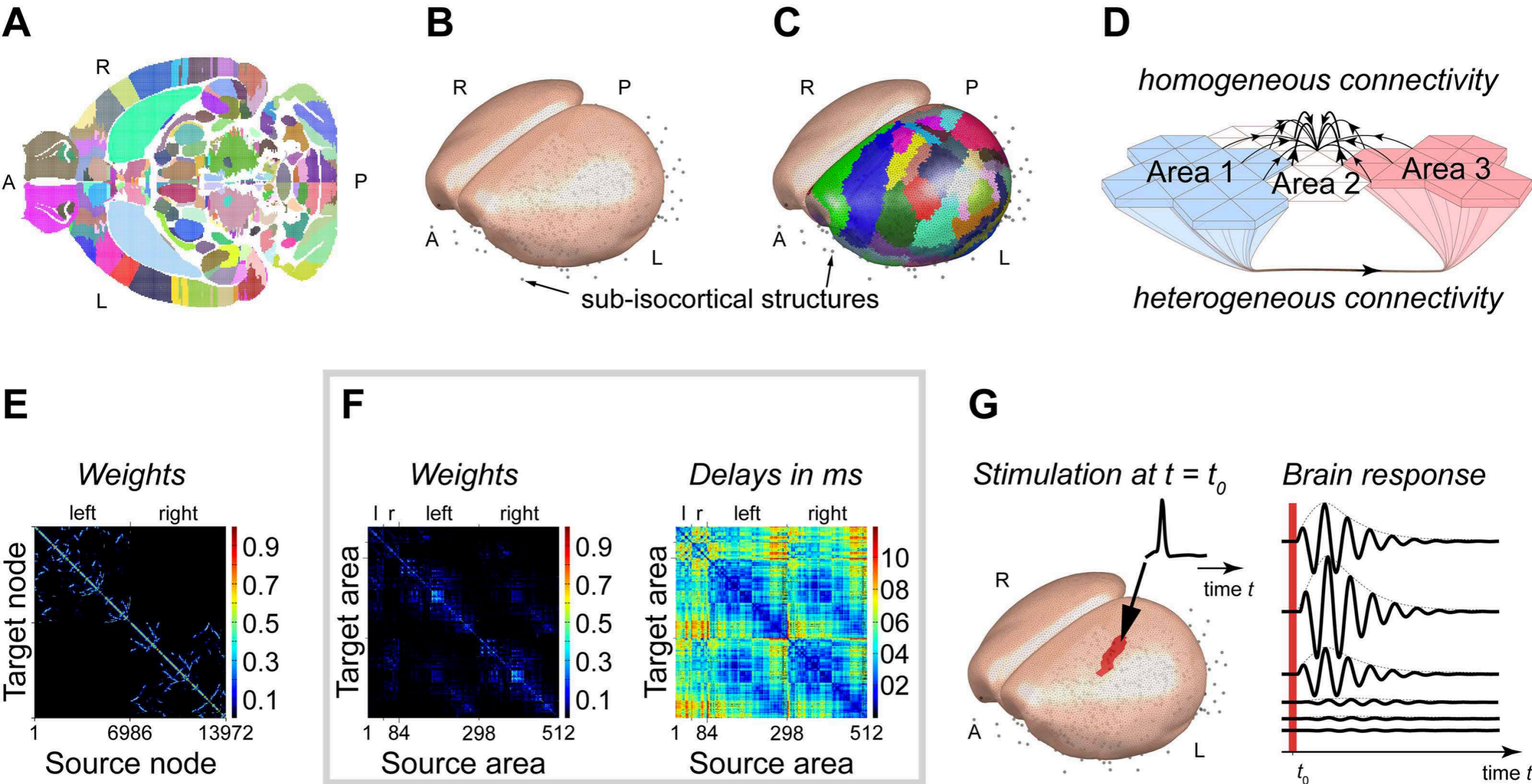
Institut de
Neurosciences
des Systèmes

STIMULATION

MANIPULATION TVB NON-INVASIVELY



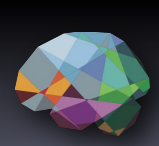
Stimulation in the Mouse



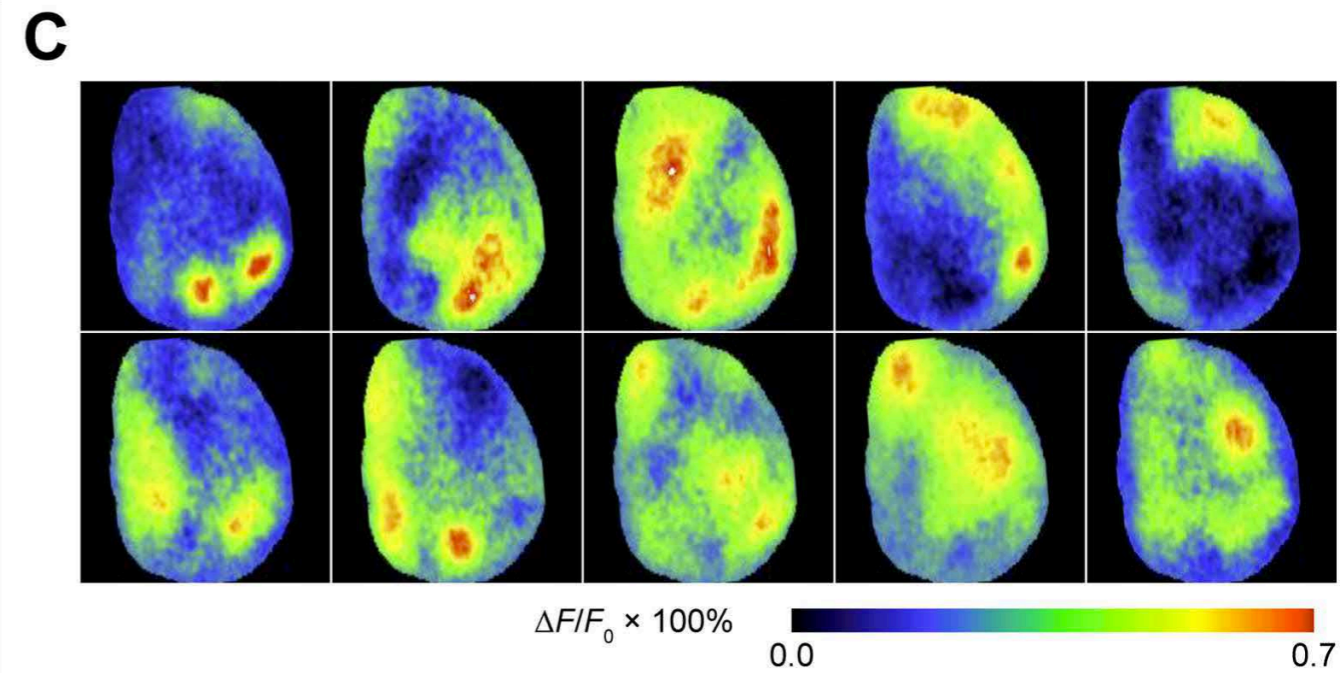
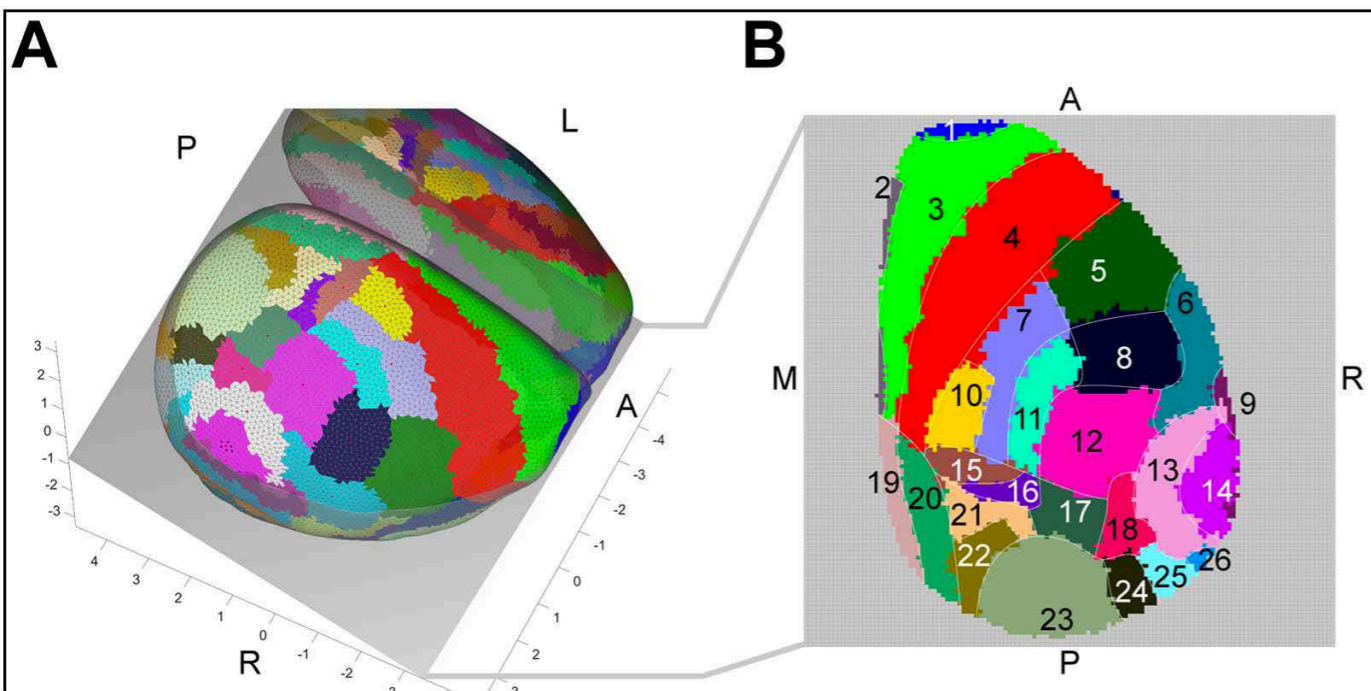
Spiegler, A., Abadchi, J. K., Mohajerani, M., & Jirsa, V. K. (2020).

In silico exploration of mouse brain dynamics by focal stimulation reflects the organization of functional networks and sensory processing.

Network Neuroscience, 4(3), 807–851. https://doi.org/10.1162/netn_a_00152



Stimulation in the Mouse

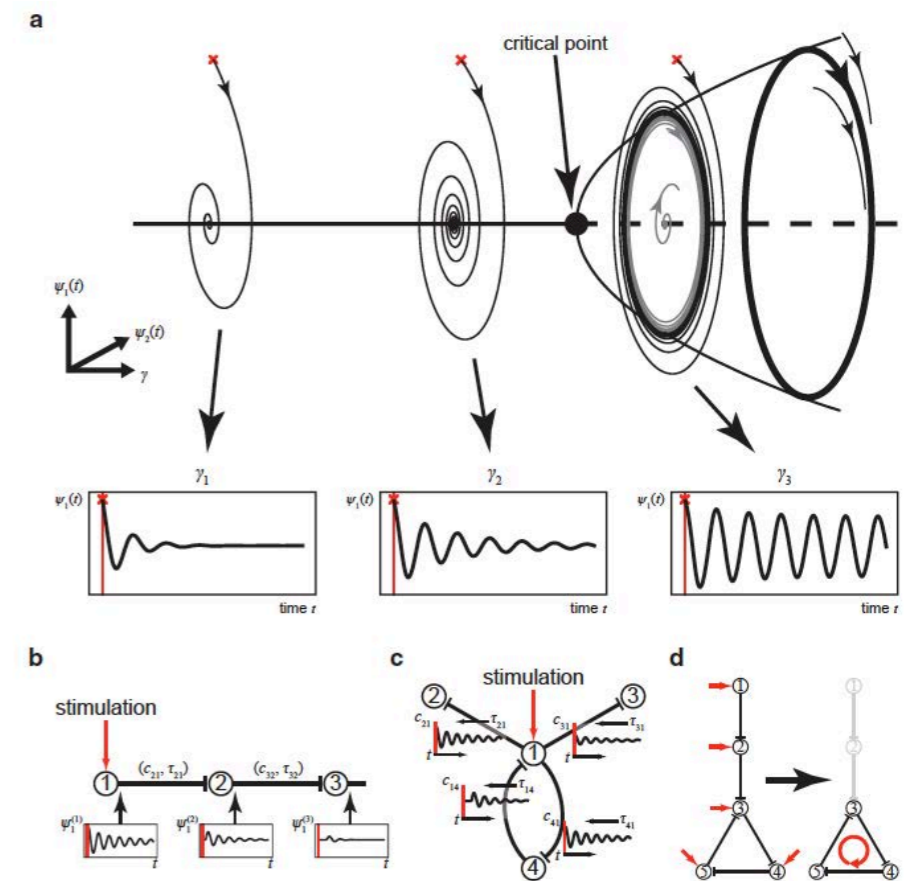
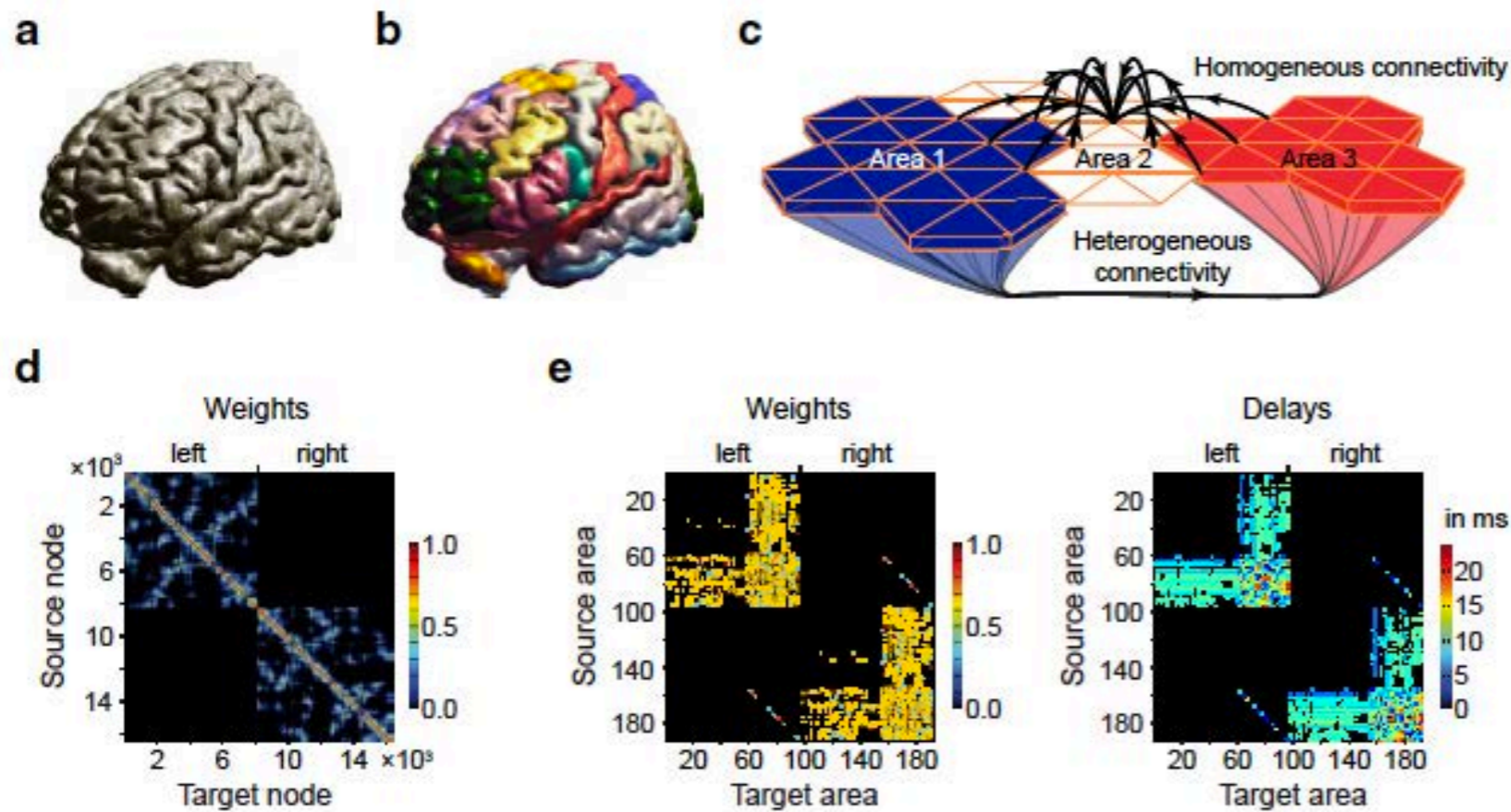


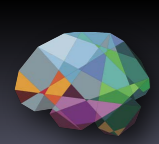
Spiegler, A., Abadchi, J. K., Mohajerani, M., & Jirsa, V. K. (2020).

In silico exploration of mouse brain dynamics by focal stimulation reflects the organization of functional networks and sensory processing.

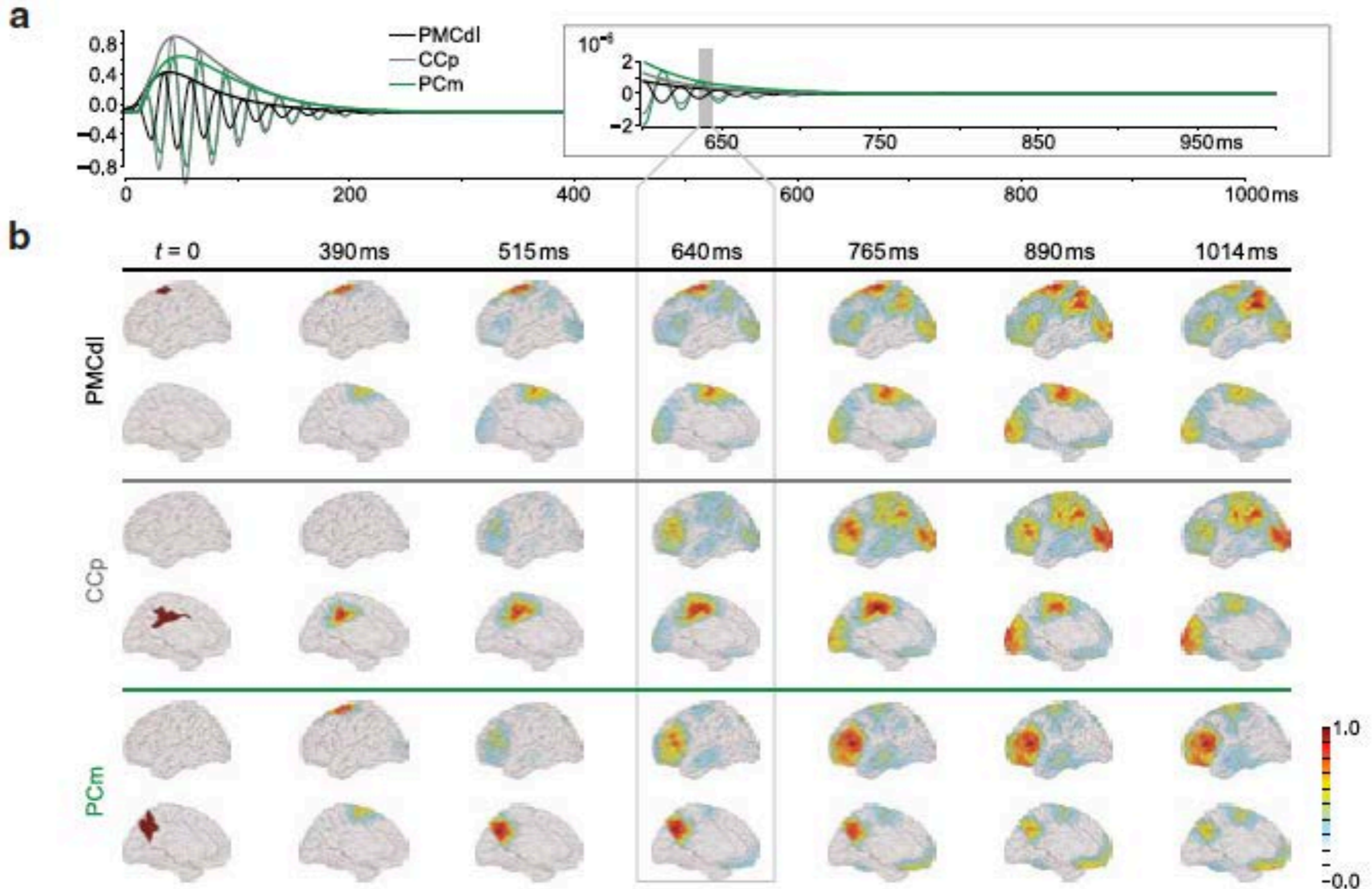
Network Neuroscience, 4(3), 807–851. https://doi.org/10.1162/netn_a_00152

Stimulation in the Human: brain region

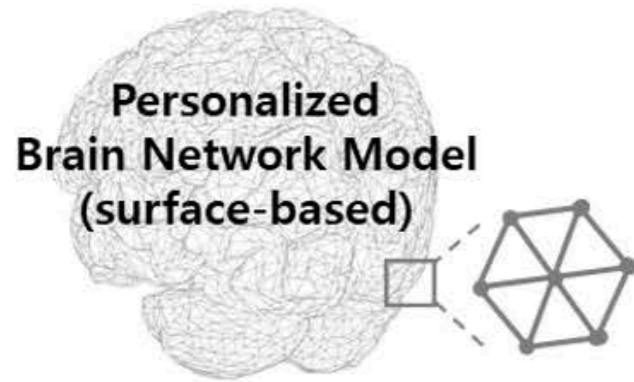




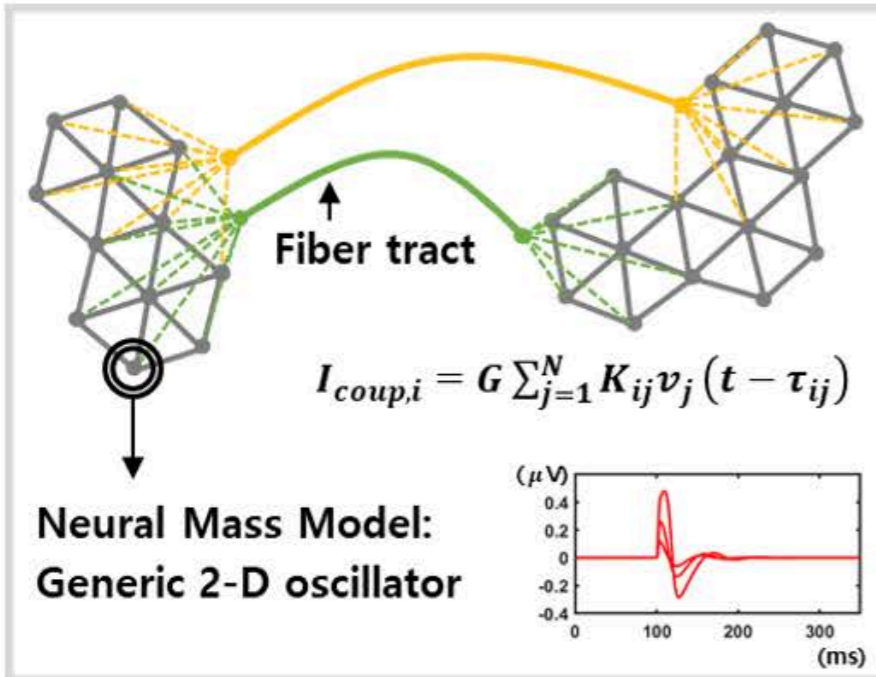
Stimulation in the Human: brain region



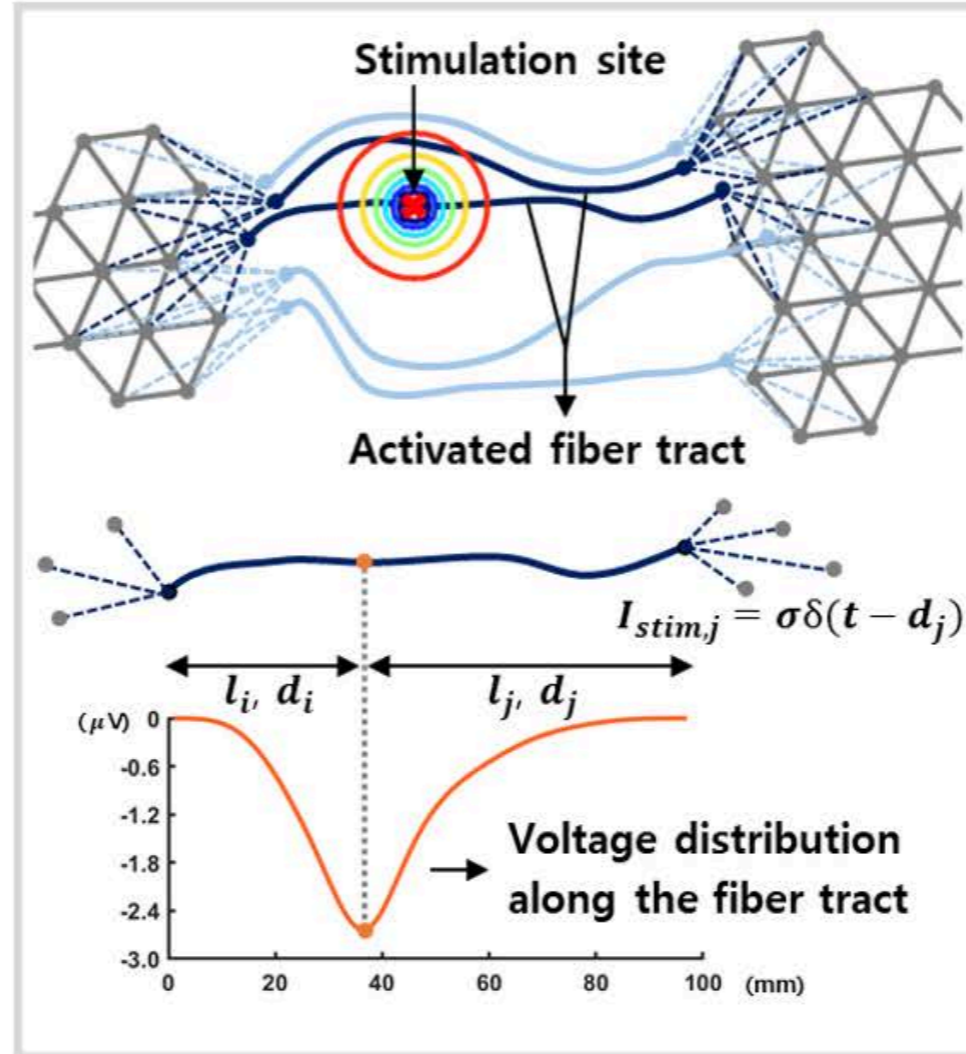
Stimulation in the Human: fibre tracts



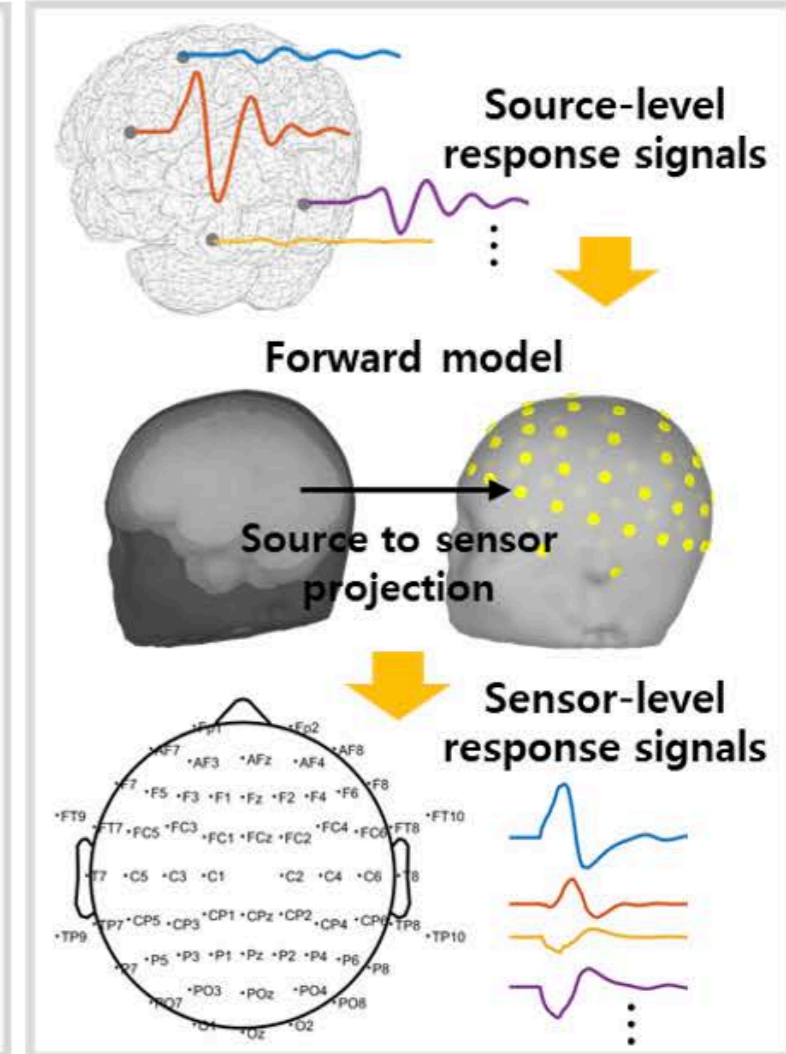
Fiber tract-based coupling

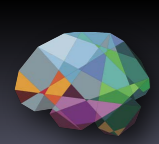


Stimulus input



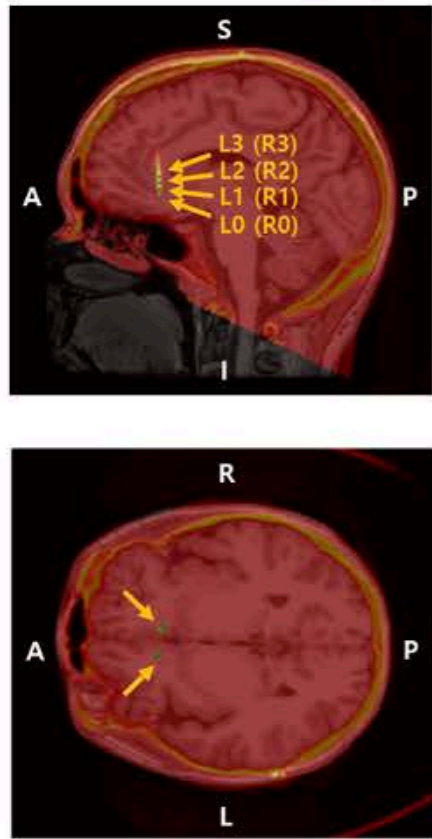
Network simulation



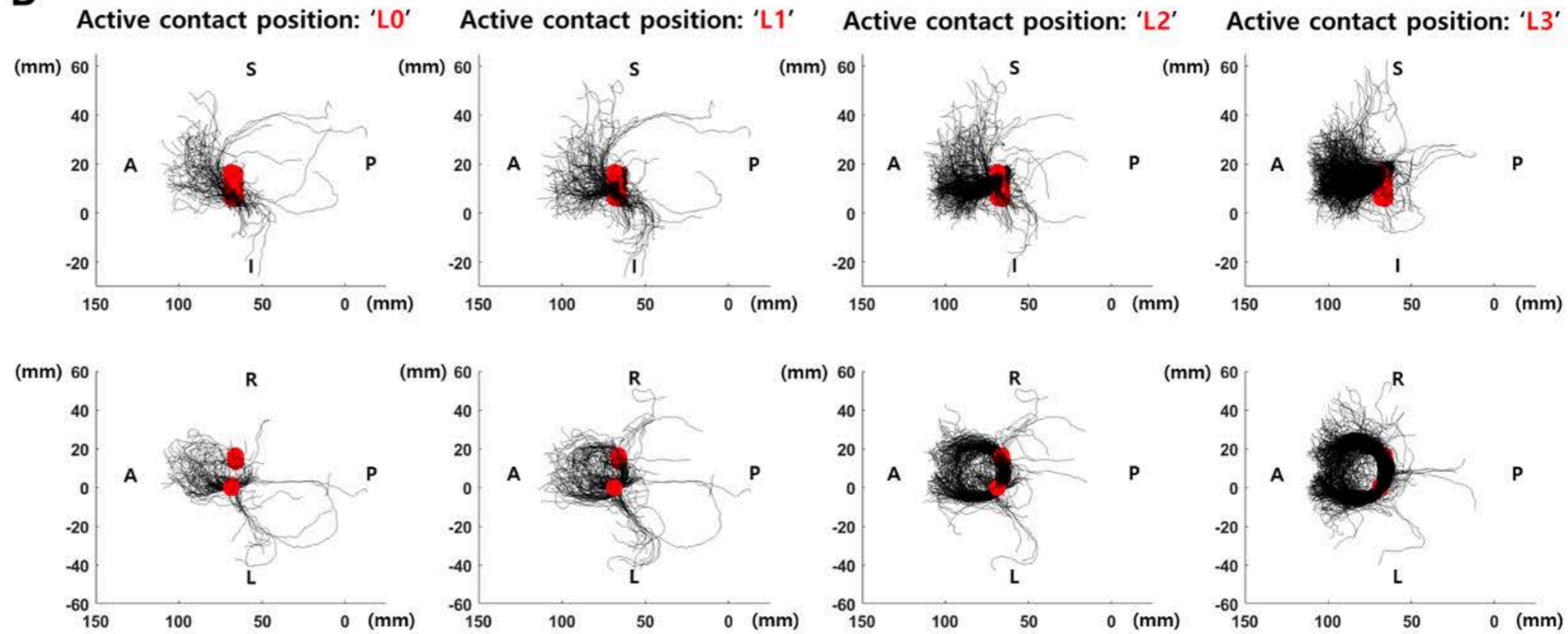


Stimulation in the Human: fibre tracts

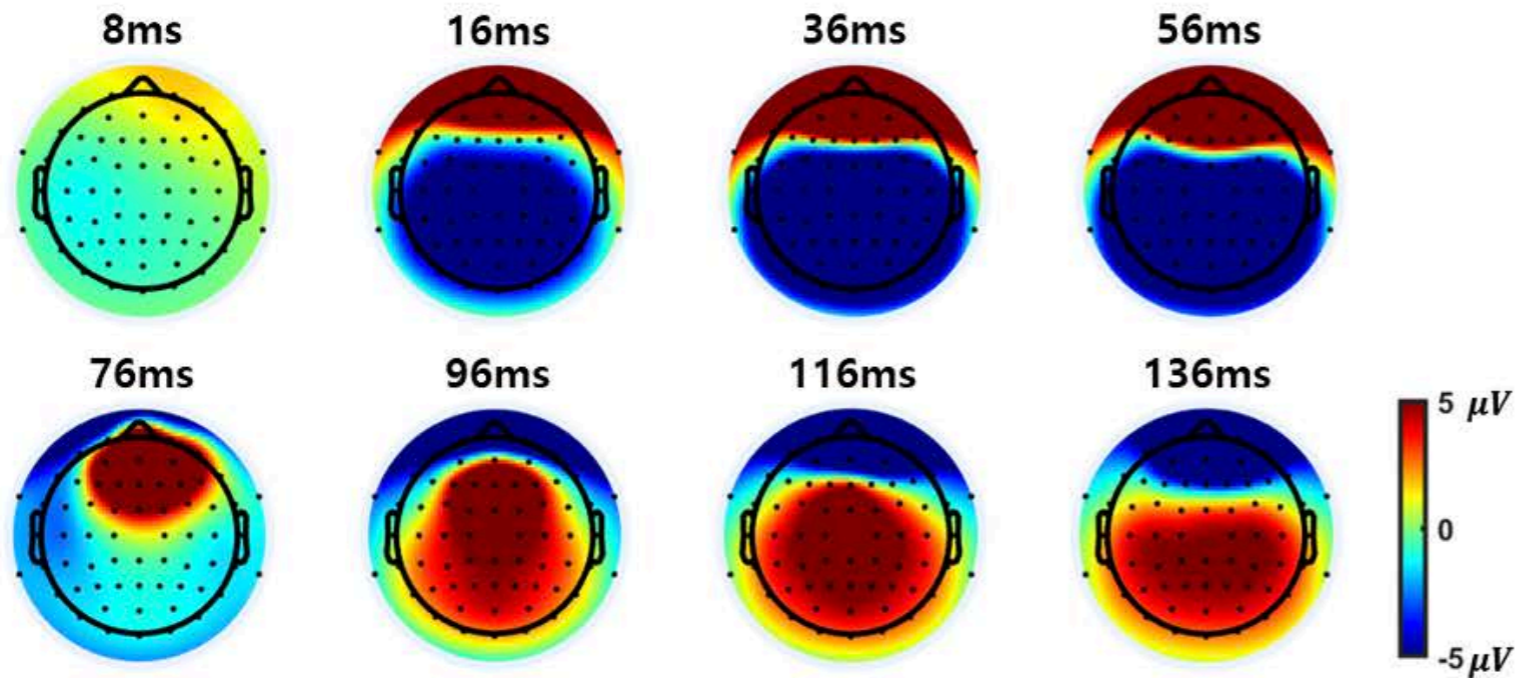
A



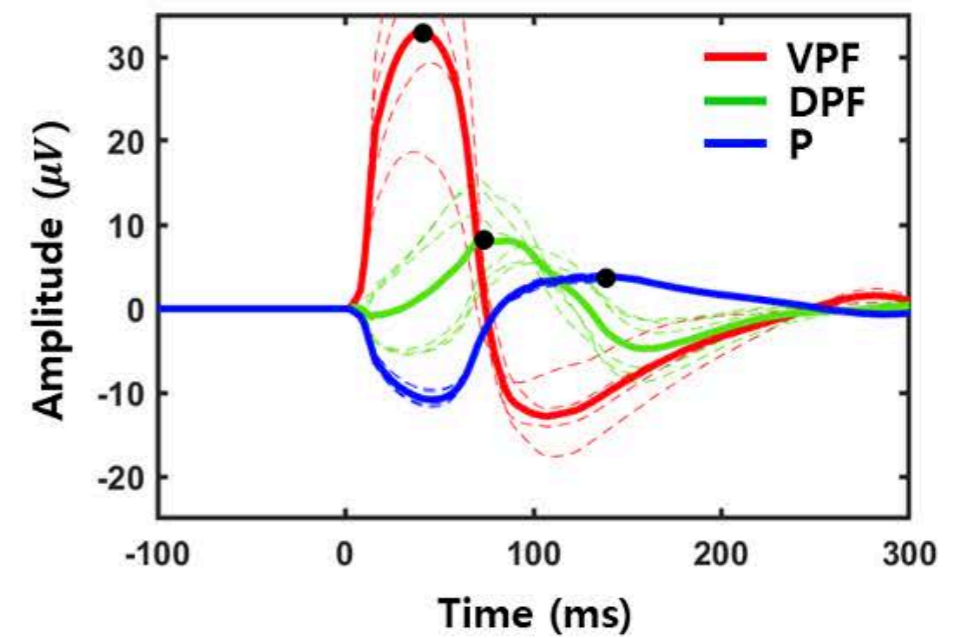
B



A



B





Institut de
Neurosciences
des Systèmes

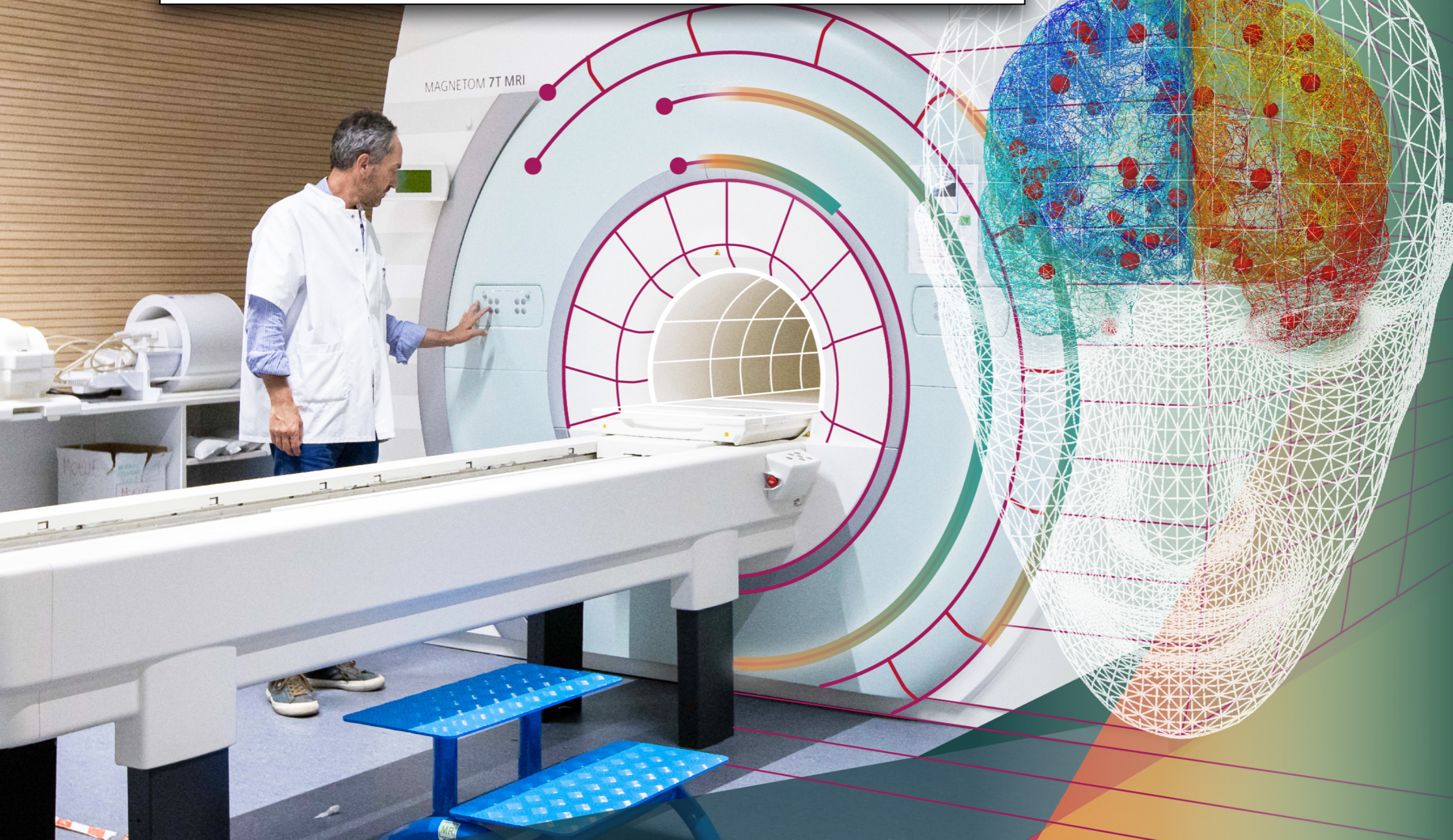
OUTLOOK

HIGH-RESOLUTION TVB AND BRAIN DISEASE



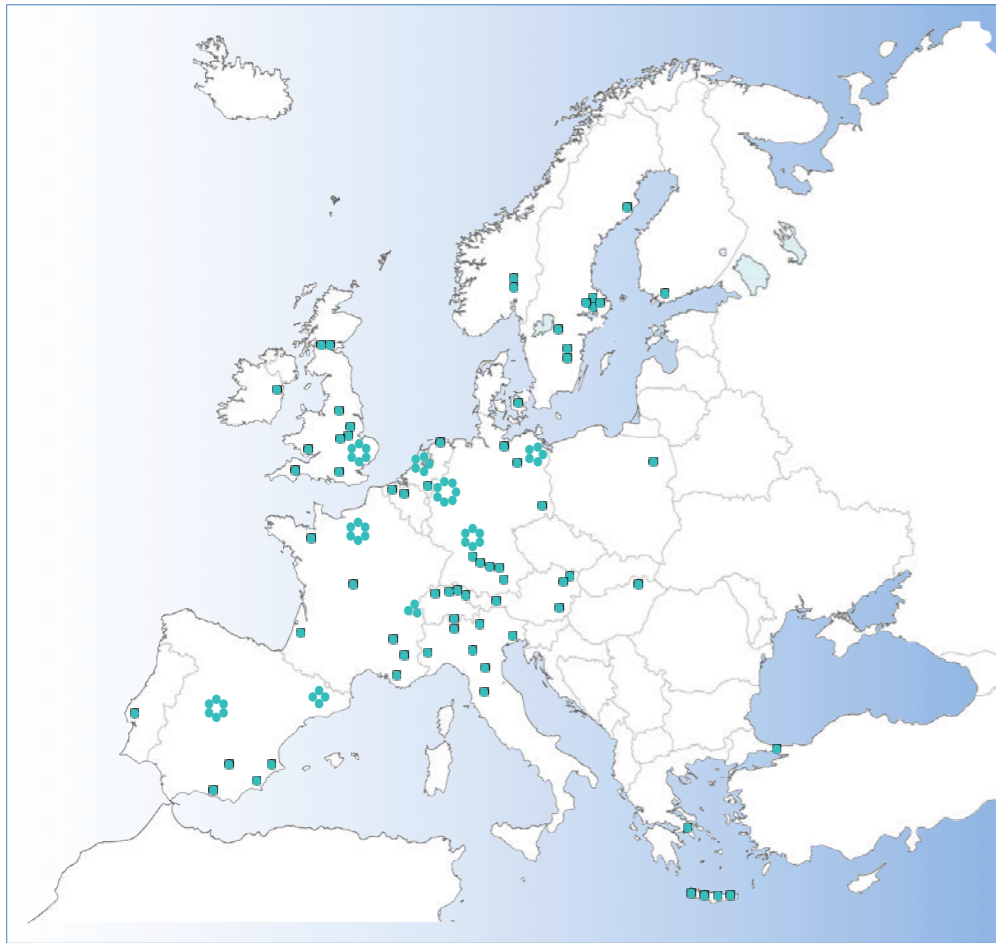
The Vision

High resolution TVB closes the gap between brain models and human imaging data. It is the key technology to personalize brain network models, serving as in-silico platforms for clinical hypothesis testing, discovery of novel treatments and biomarkers





Human Brain Project



« Understanding the brain »

« Healing the brain »

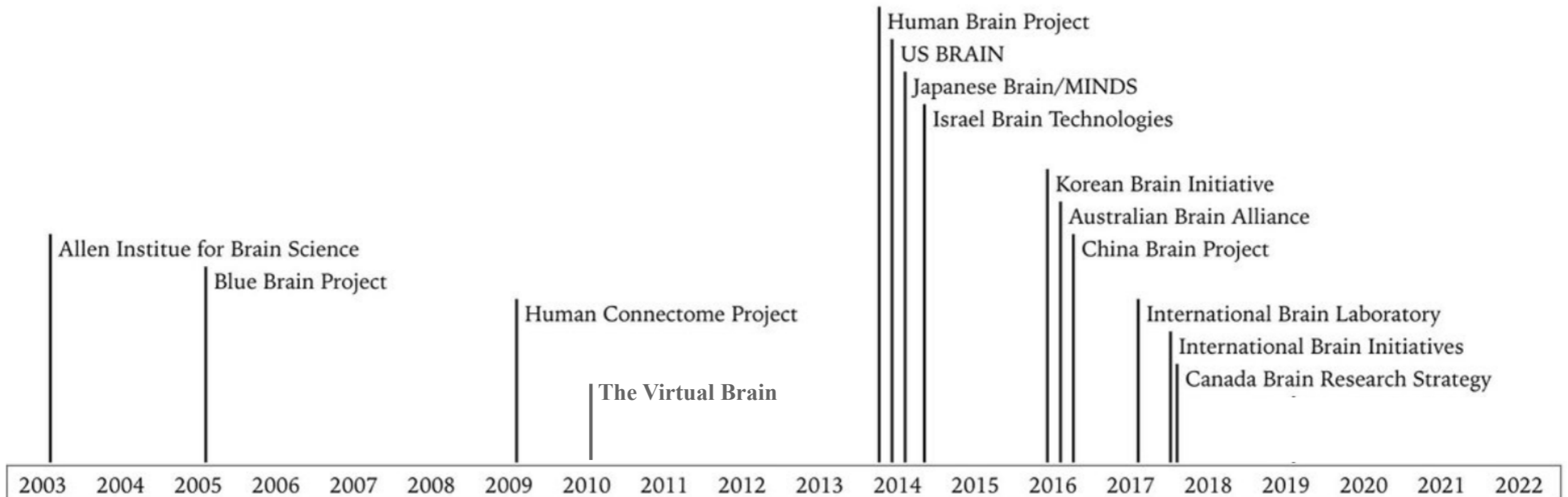
« Modeling the brain »

Basic science, health & technology

The strongest driving force for neuroscience today is the societal demands for treatment of brain disease

Cost of dementia alone will surpass all of cancer

2015: number of people in age group 60-64 surpassed number in age group 20-24



SERVICE CATEGORY

Data and Knowledge

SERVICE CATEGORY

Atlases

SERVICE CATEGORY

Simulation

SERVICE CATEGORY

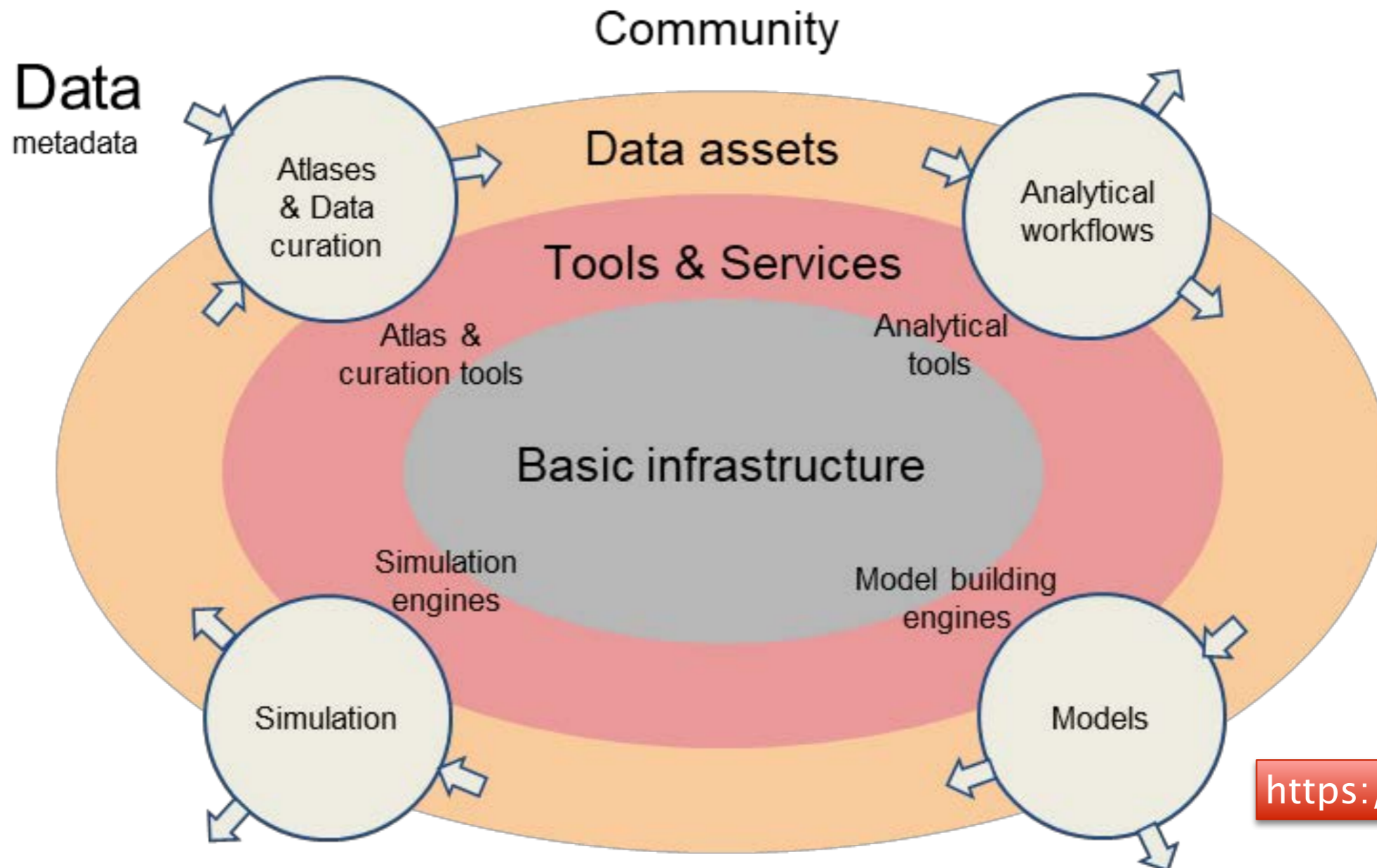
Brain-Inspired Technologies

SERVICE CATEGORY

Medical Data Analytics



EBRAINS



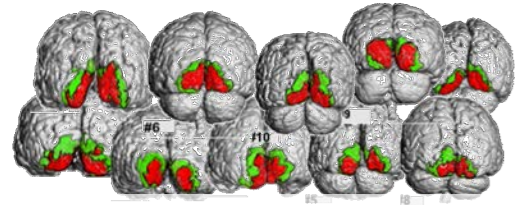
<https://ebrains.eu>



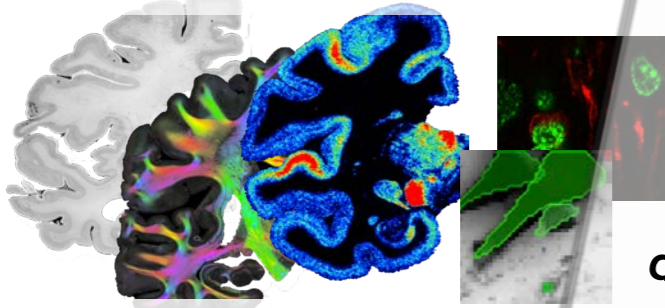
Human Brain Project



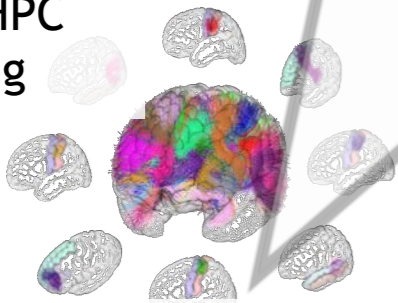
EBRAINS



Decades of histological projects in different labs



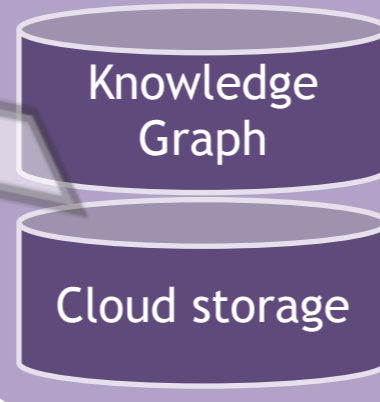
Massive HPC processing



Tens of thousands of brain scans

data curation

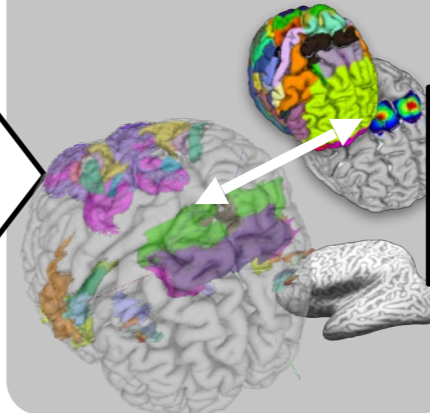
EBRAINS data services



Sustainable FAIR data sharing

HTTP API

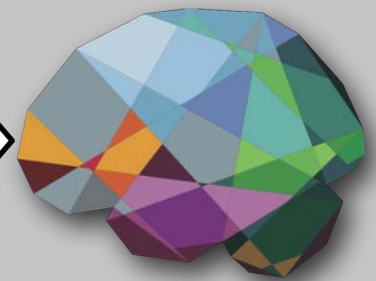
EBRAINS atlas services



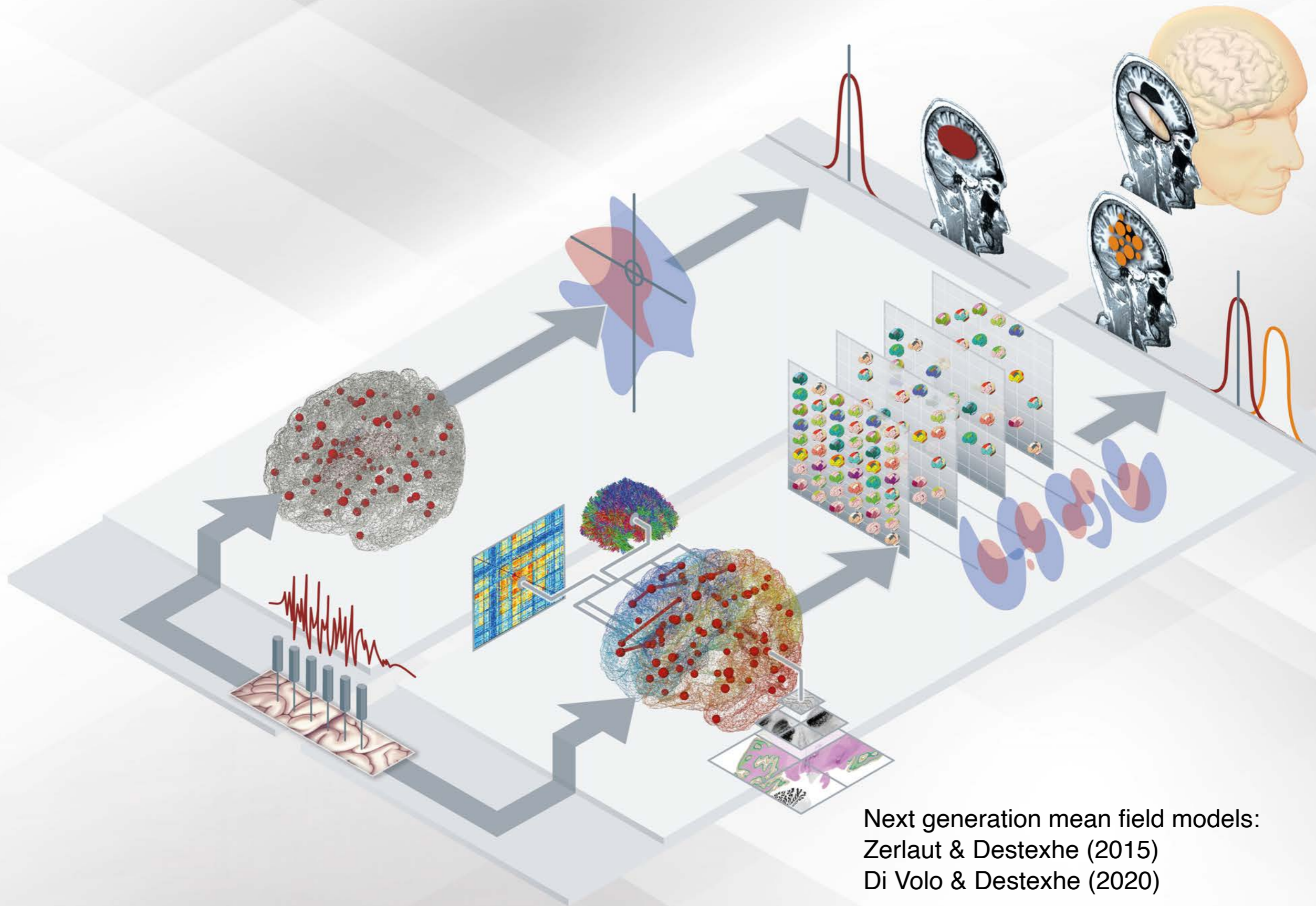
Multilevel integration of data & brain regions

Python client

The Virtual Brain



Features of regional variability „at a fingertip“



Next generation mean field models:
Zerlaut & Destexhe (2015)
Di Volo & Destexhe (2020)

Current Generation - Virtual Epileptic Patient (VEP)

State of the art

Network size: 100-200 network nodes

Connectivity: personalized white matter connectome

Average region size: 20cm²

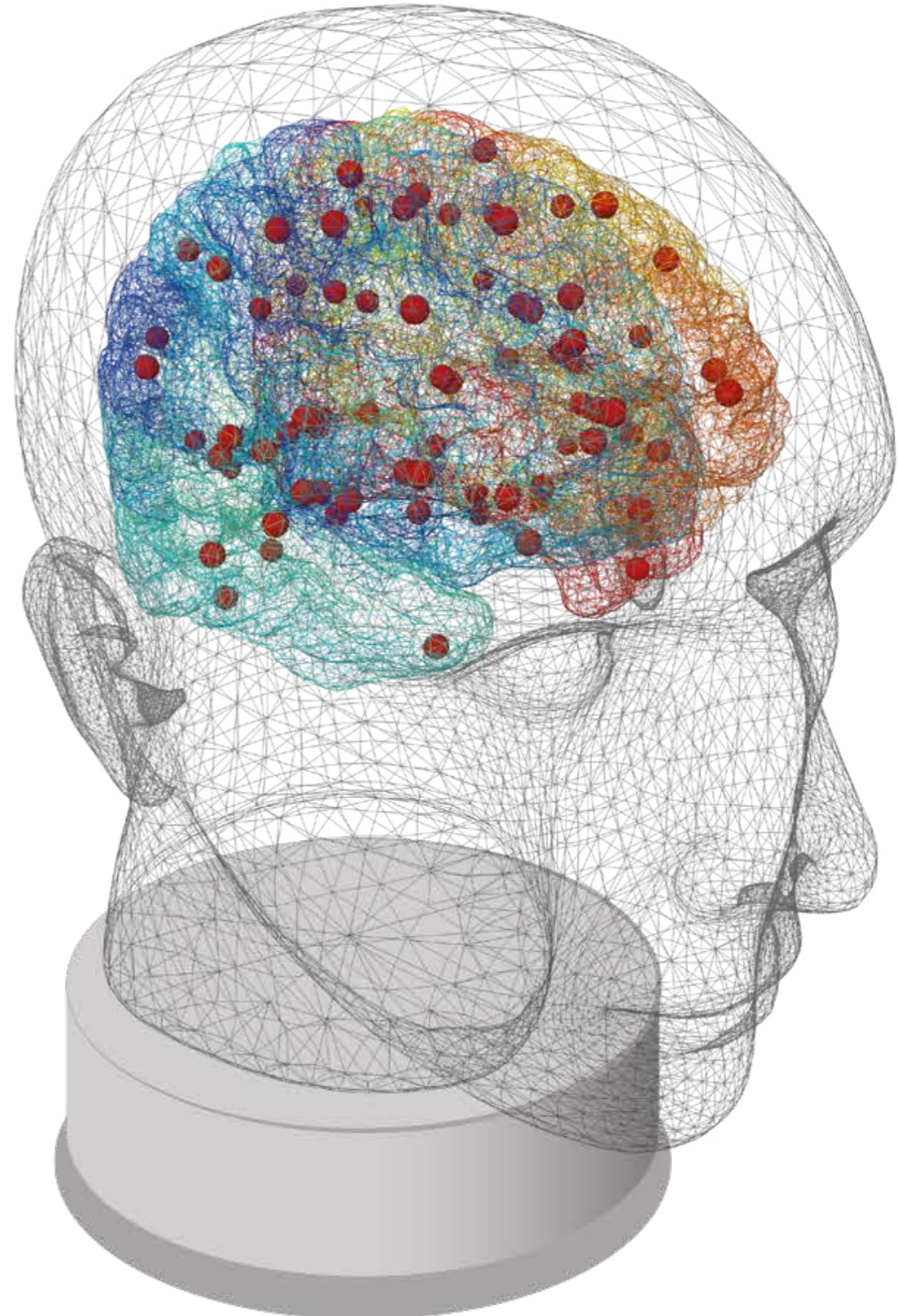
Minimal fiber lengths: 3-5cm

Challenges

Impossibility to integrate high-resolution data

Source-to-sensor mapping is sub-optimal

Dynamic range of seizure variability is limited



Current Generation - Virtual Epileptic Patient (VEP)

State of the art

Network size: 100-200 network nodes

Connectivity: personalized white matter connectome

Average region size: 20cm²

Minimal fiber lengths: 3-5cm

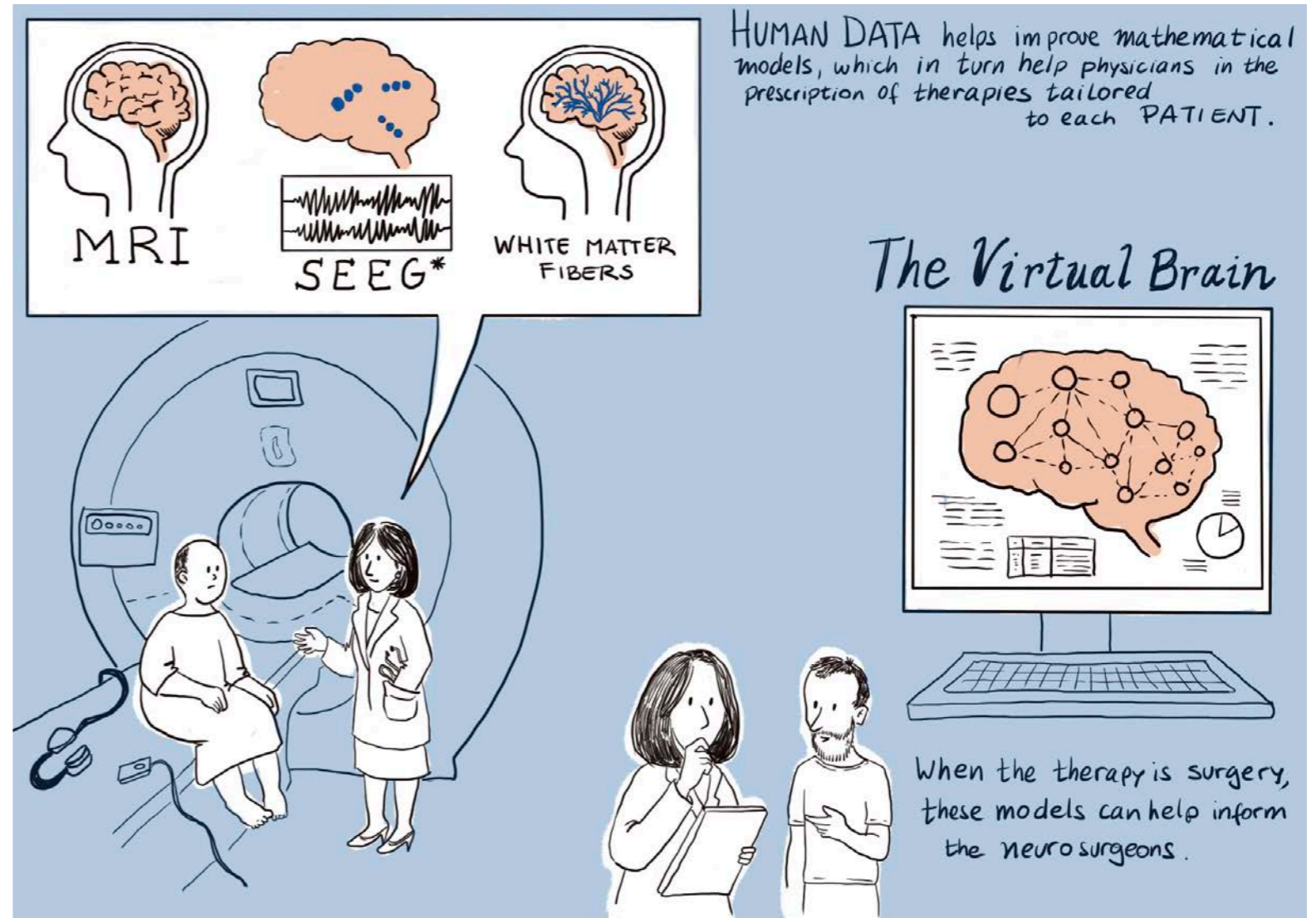
Challenges

Impossibility to integrate high-resolution data

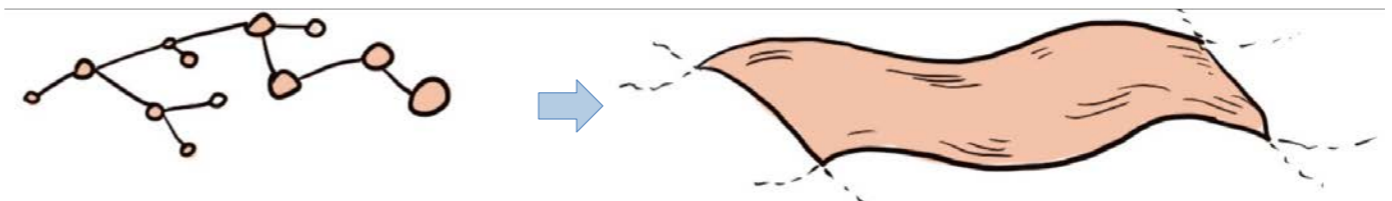
Source-to-sensor mapping is sub-optimal

Dynamic range of seizure variability is limited

Saggio et al eLife (2020); Sip et al PLoS CB (2021)



Transition from discrete to continuous models





Next Generation - Virtual Epileptic Patient (VEP) coming now

Low and high-resolution meshes span cortical surface

Network size:

Low-resolution mesh:
20,000 nodes

High-resolution mesh:
260,000 nodes

Connectivity:

- High-resolution intracortical
- High-resolution corticocortical
- personalized connectome from DTI

Average region size:

2-3mm² (high resolution)

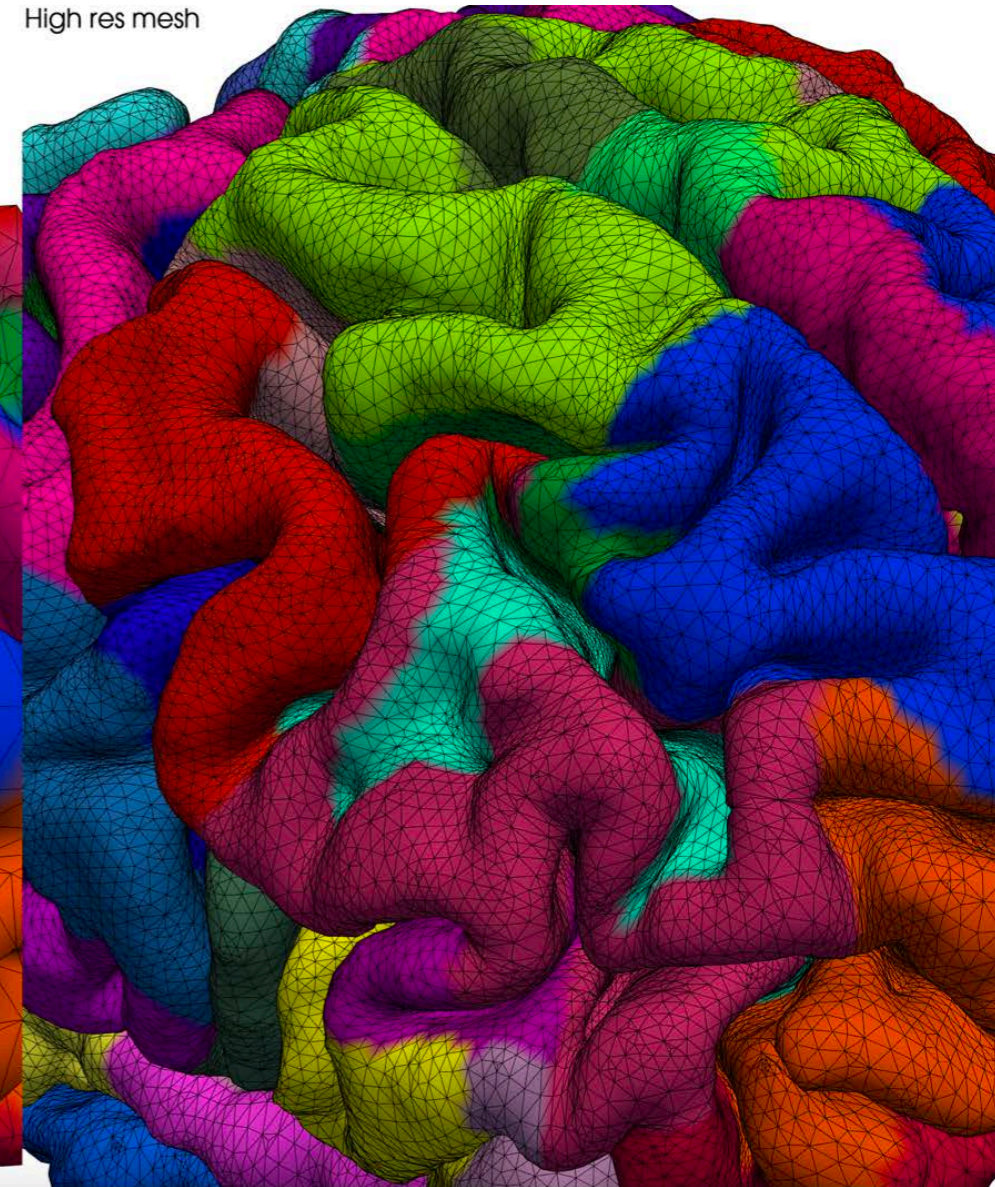
Minimal fiber lengths:

1mm

Low res mesh



High res mesh



Informative prior of individual brain data is most predictive (Hashemi et al (under review))



Next Generation - Virtual Epileptic Patient (VEP) coming now

Network size:

Low-resolution mesh:
20,000 nodes

High-resolution mesh:
260,000 nodes

Connectivity:

- High-resolution intracortical
- High-resolution corticocortical
- personalized connectome from DTI

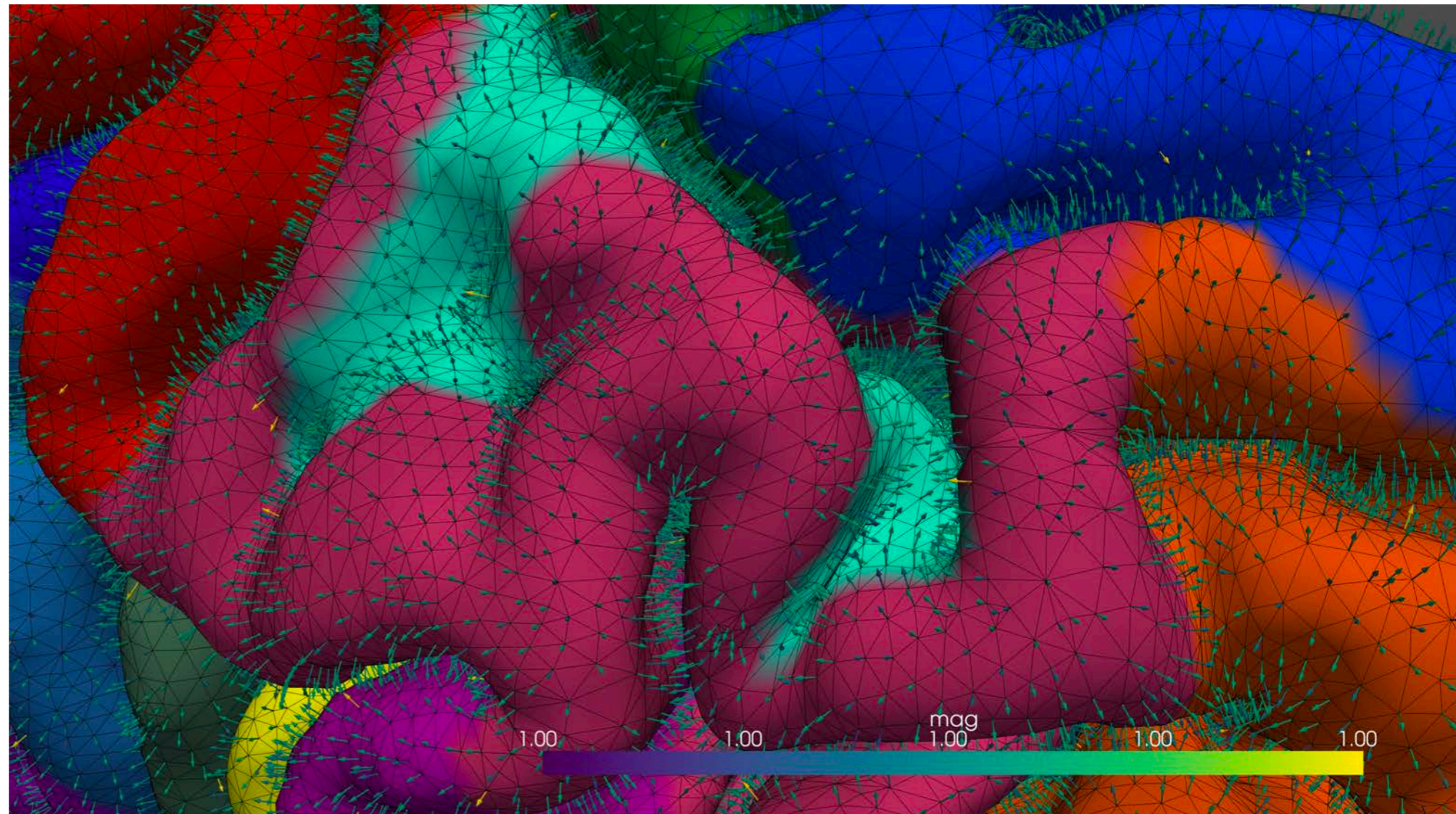
Average region size:

2-3mm² (high resolution)

Minimal fiber lengths:

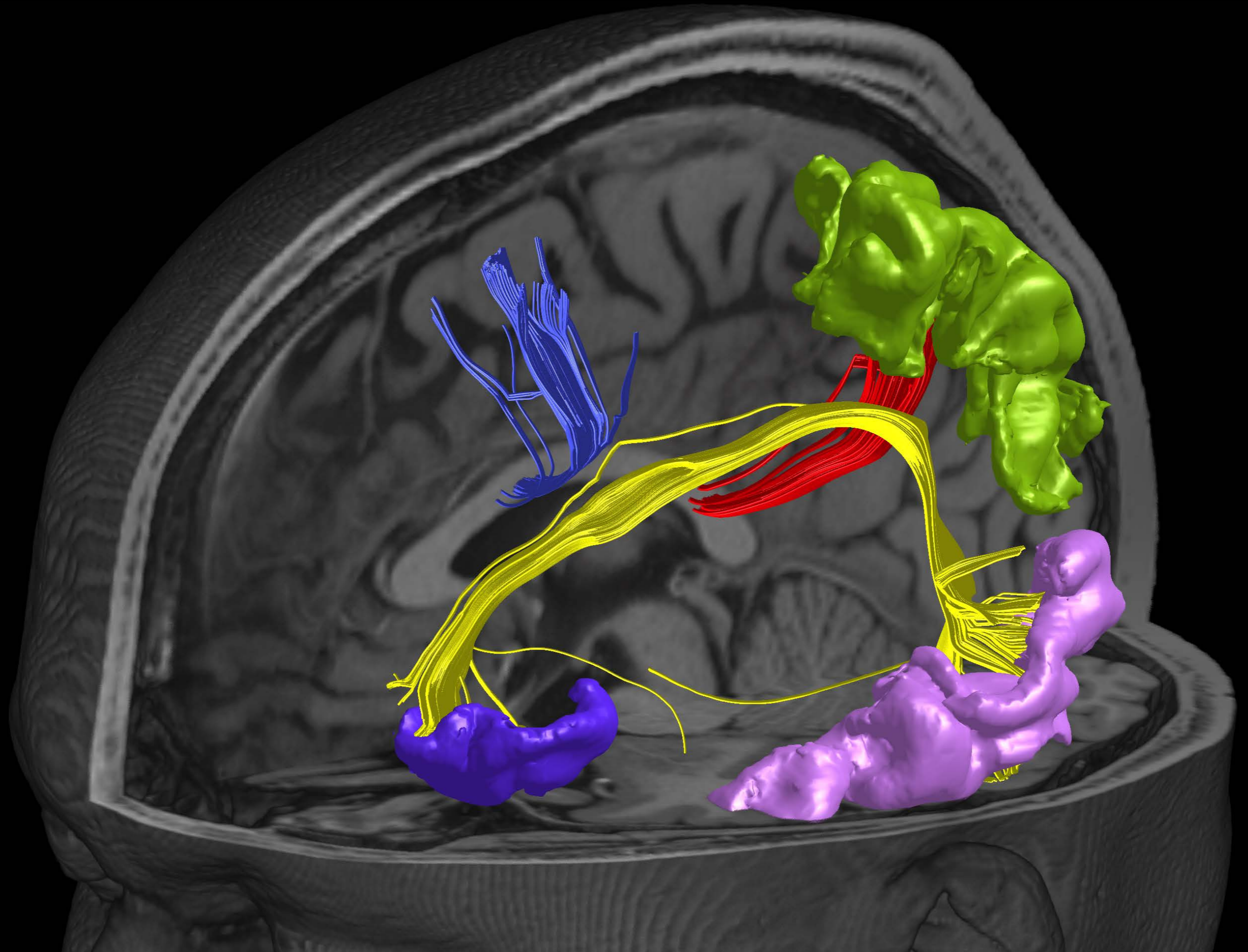
1mm

Dipolar momenta are oriented perpendicular to cortical surface



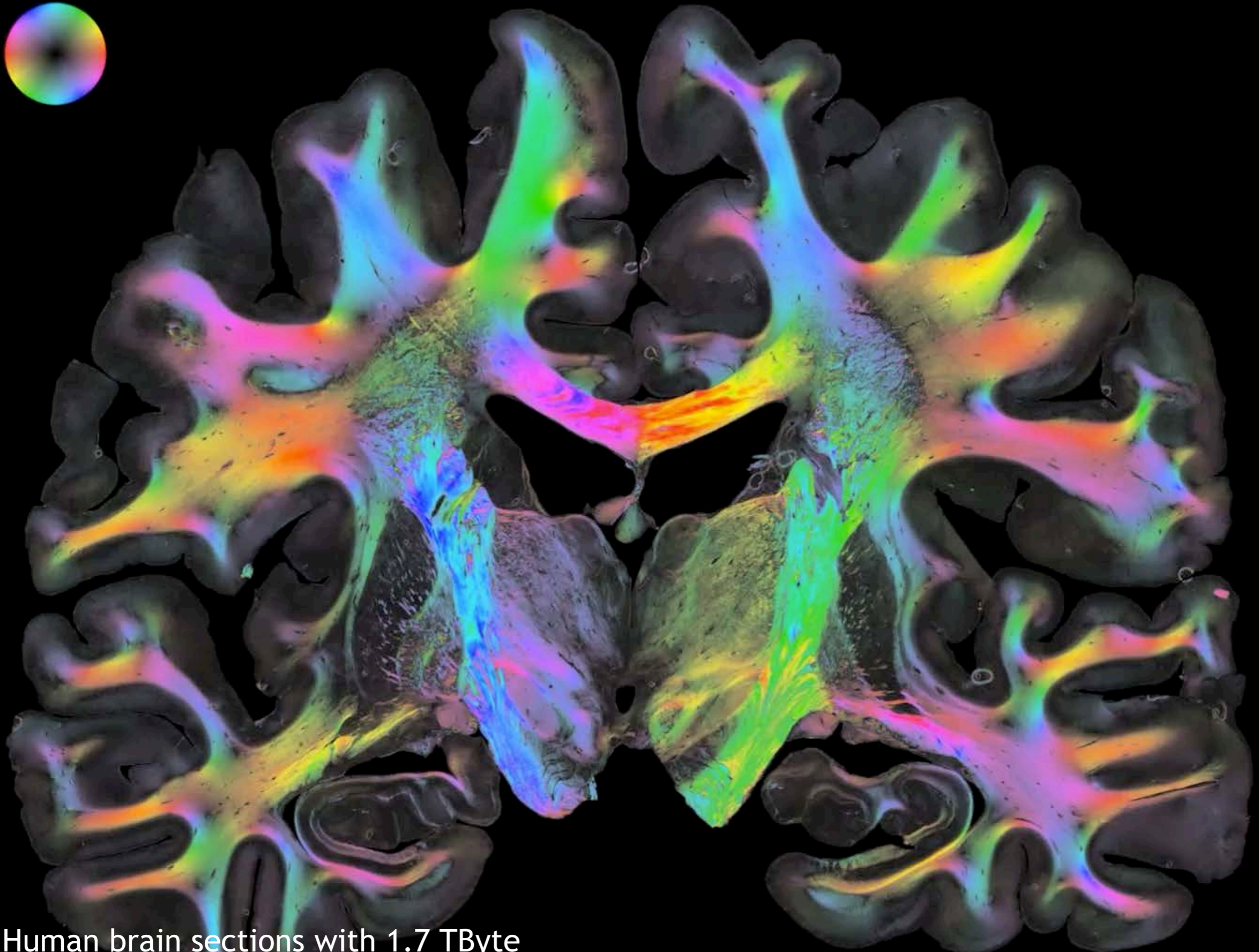
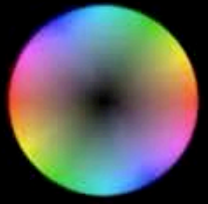


Next Generation - Virtual Epileptic Patient (VEP) coming now





Next Generation - Virtual Epileptic Patient (VEP) coming now

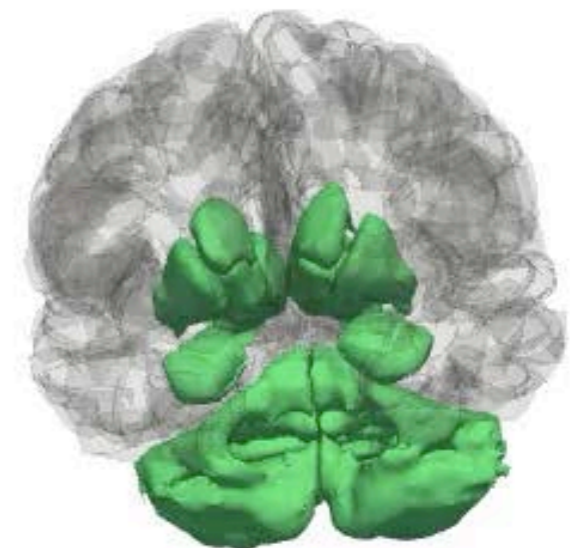
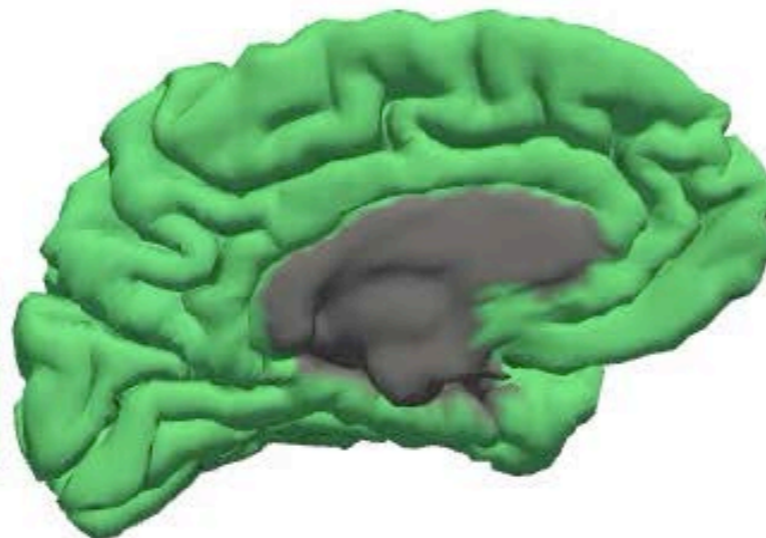
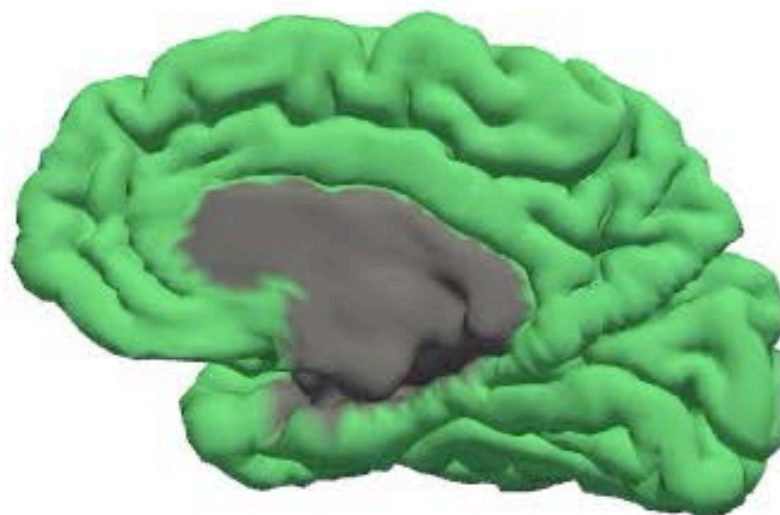
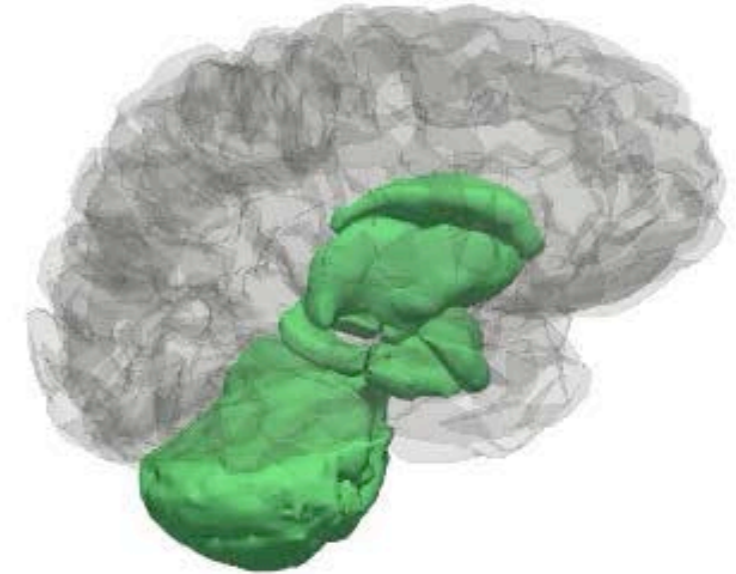
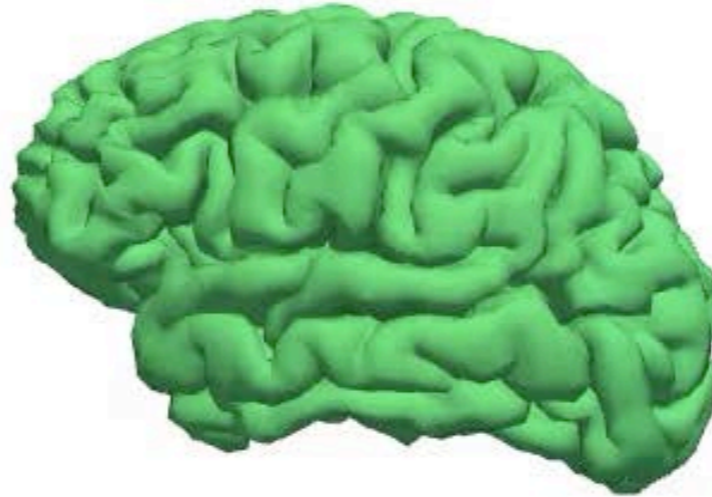
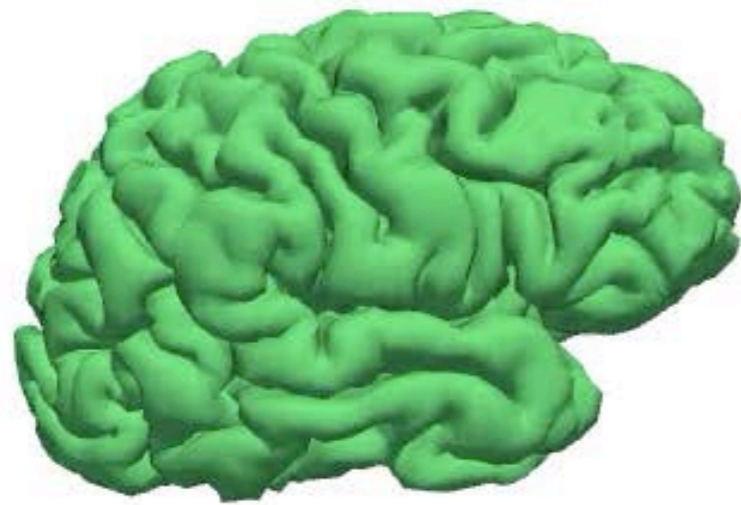


Human brain sections with 1.7 TByte
Runs on JURECA @ JSC, Axer et al., Juelich



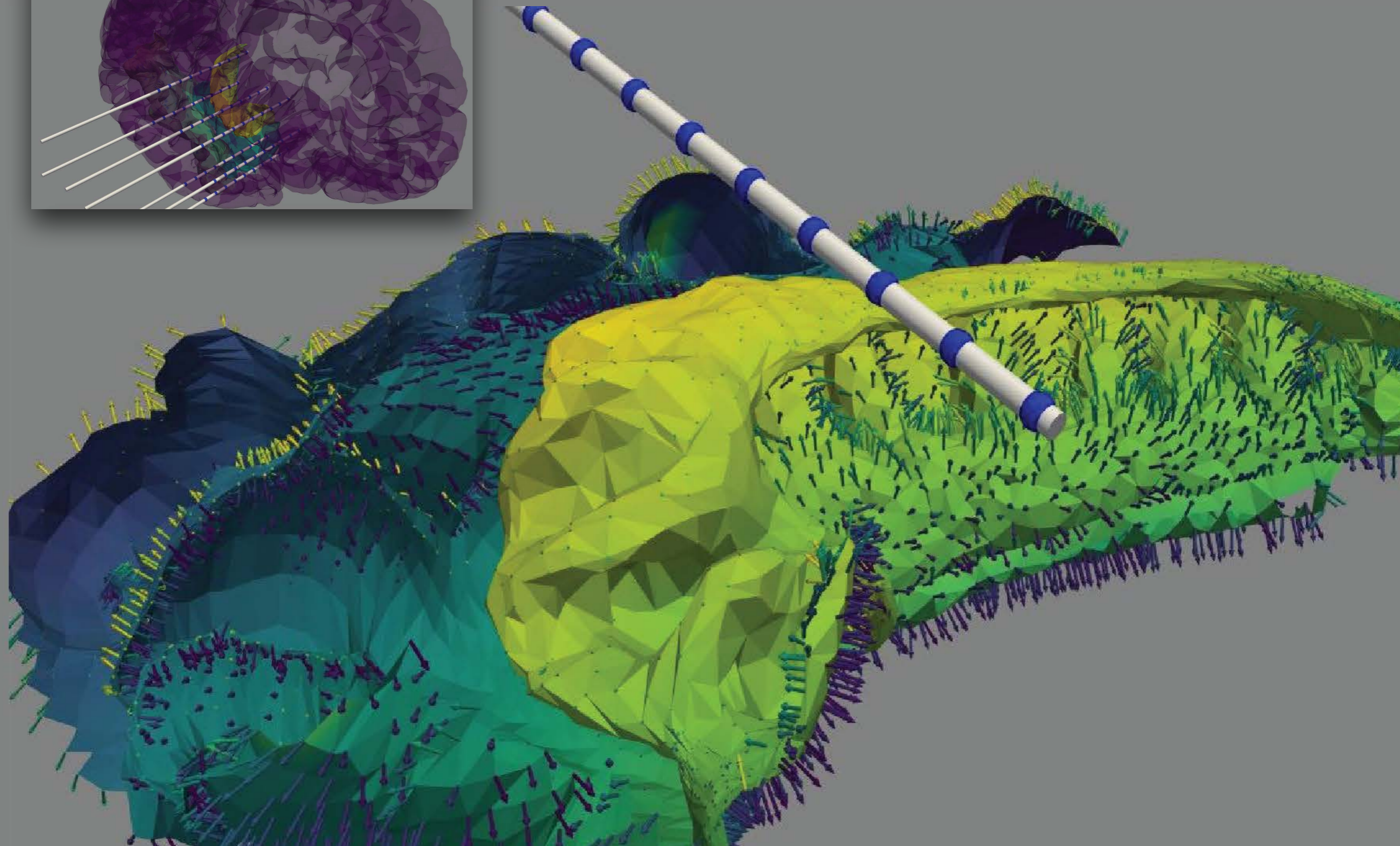
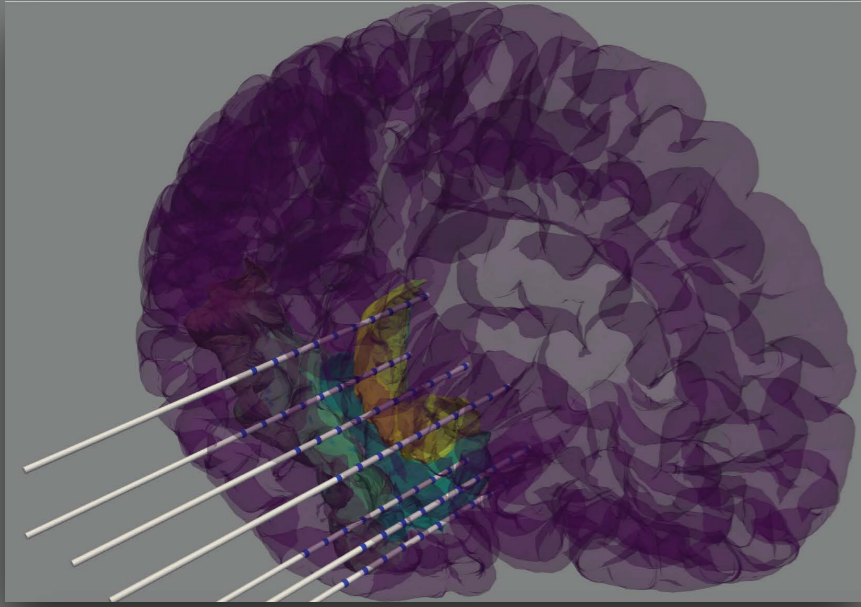
Next Generation - Virtual Epileptic Patient (VEP) coming now

0 sec





Next Generation - Virtual Epileptic Patient (VEP) coming now

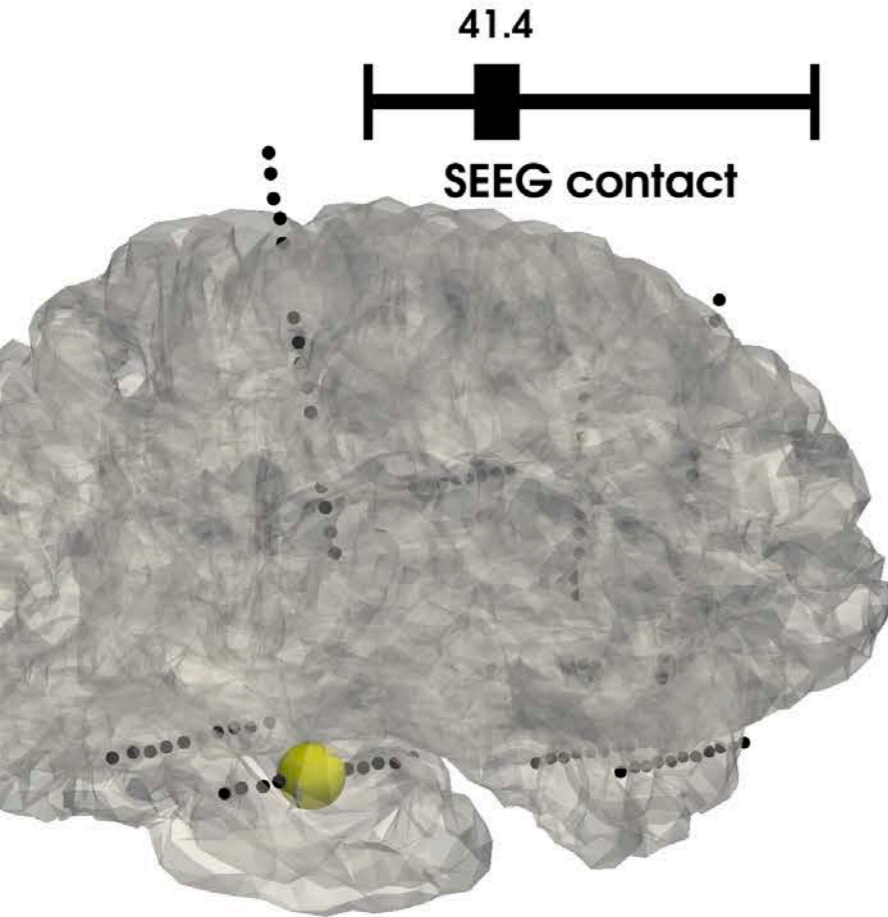




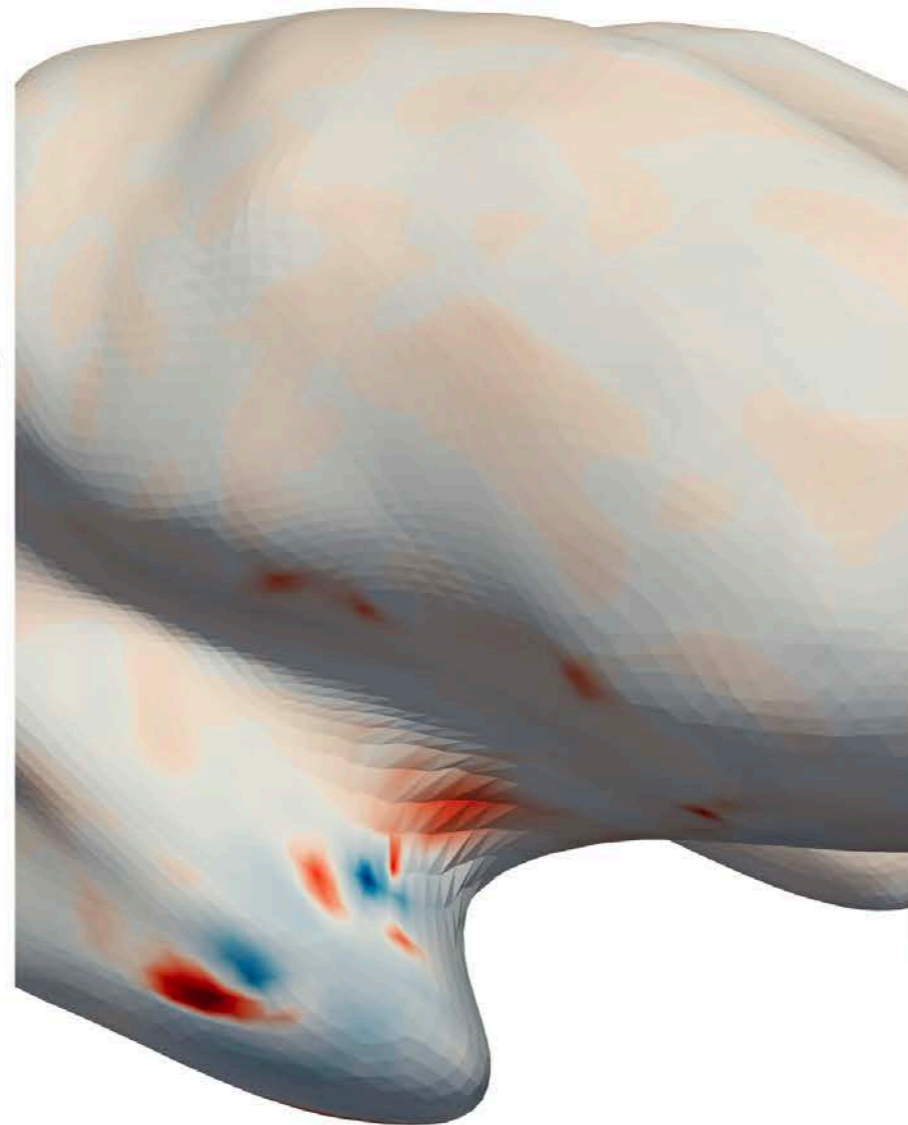
Next Generation - Virtual Epileptic Patient (VEP) coming now

Model inversion using gain matrices of the source-to-sensor forward solution

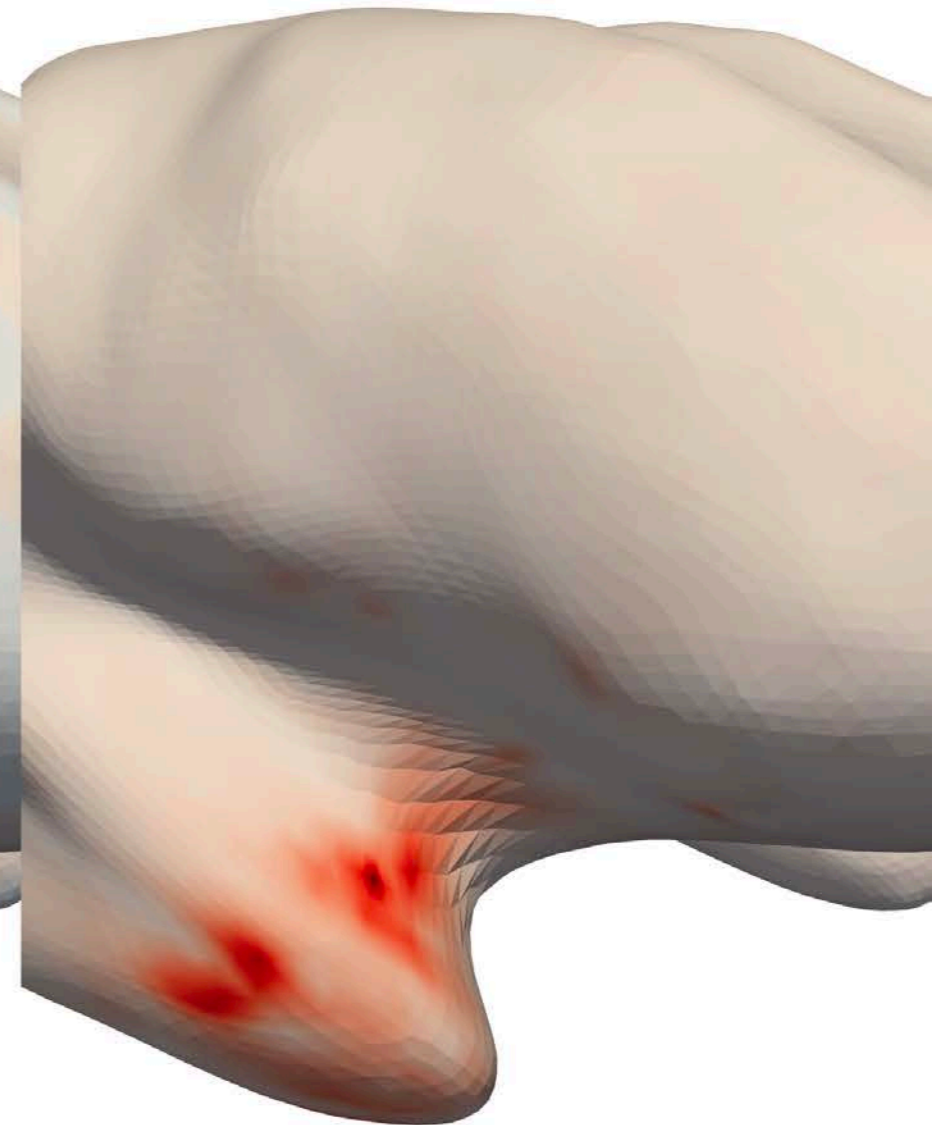
A7



Dipole mapping

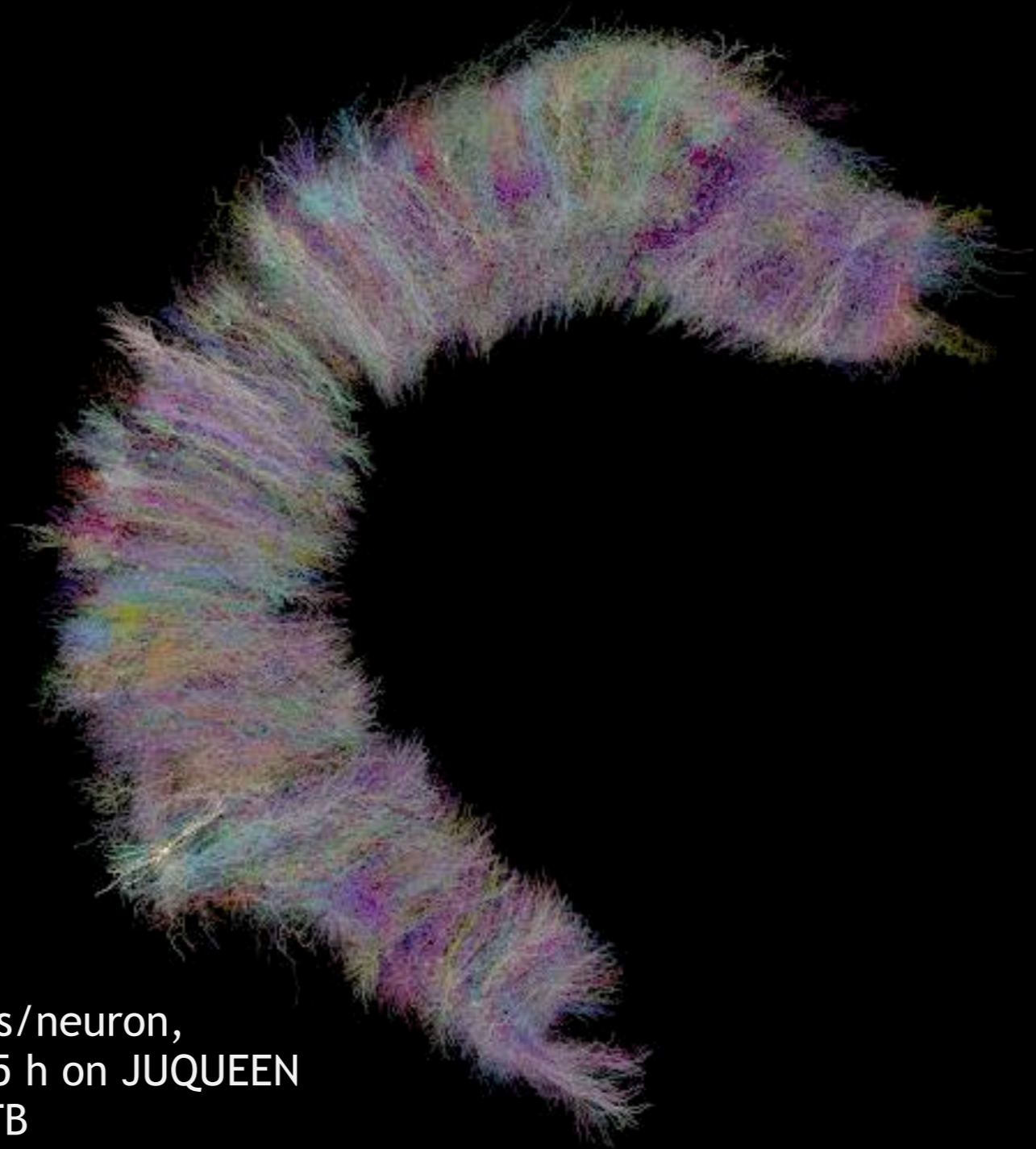


Distance mapping only





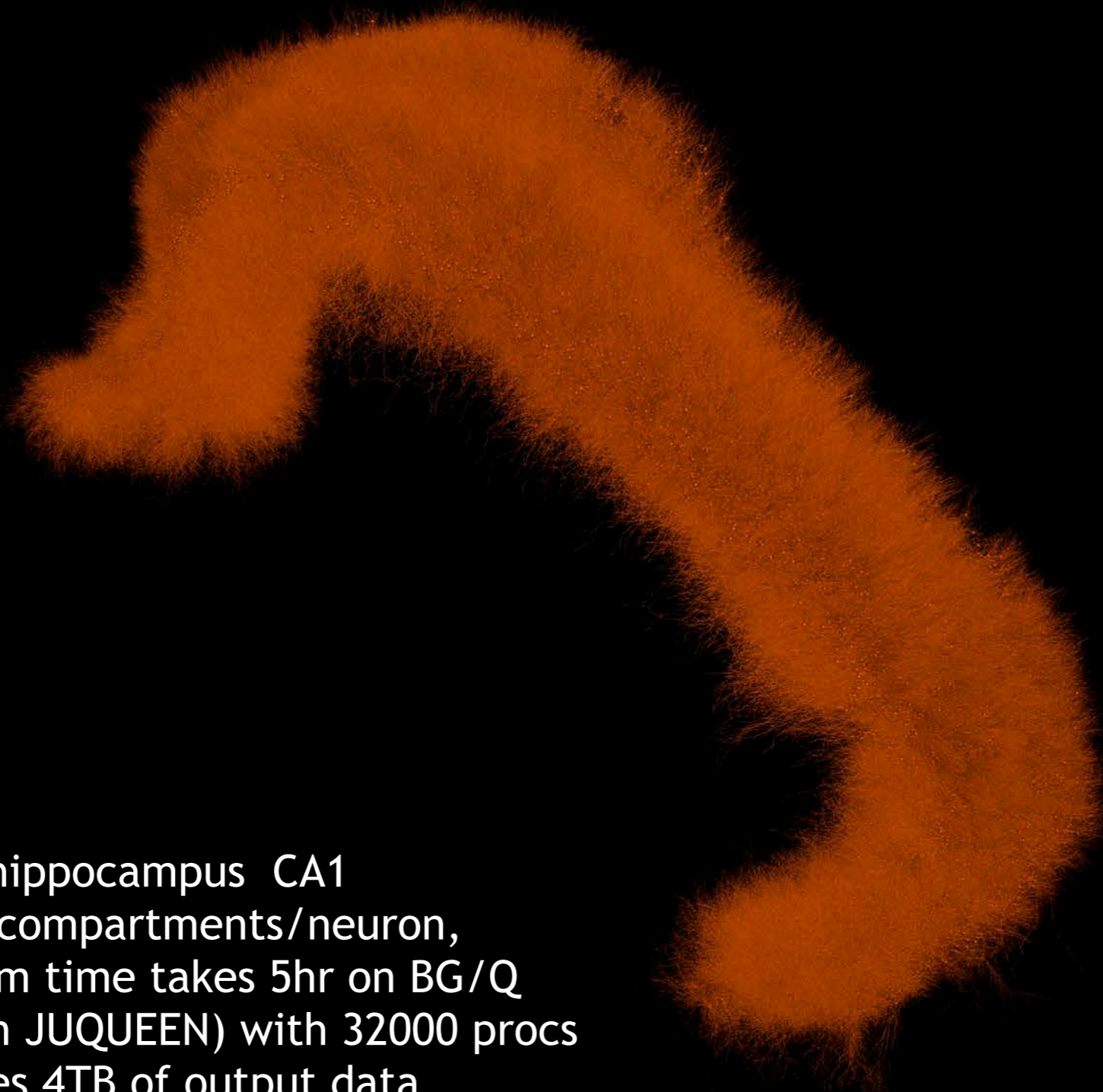
Next Generation - Virtual Epileptic Patient (VEP) coming now



mouse, CA1 region
~1'000 compartments/neuron,
1'' simulation needs 5 h on JUQUEEN
generates approx. 4TB



Next Generation - Virtual Epileptic Patient (VEP) coming now



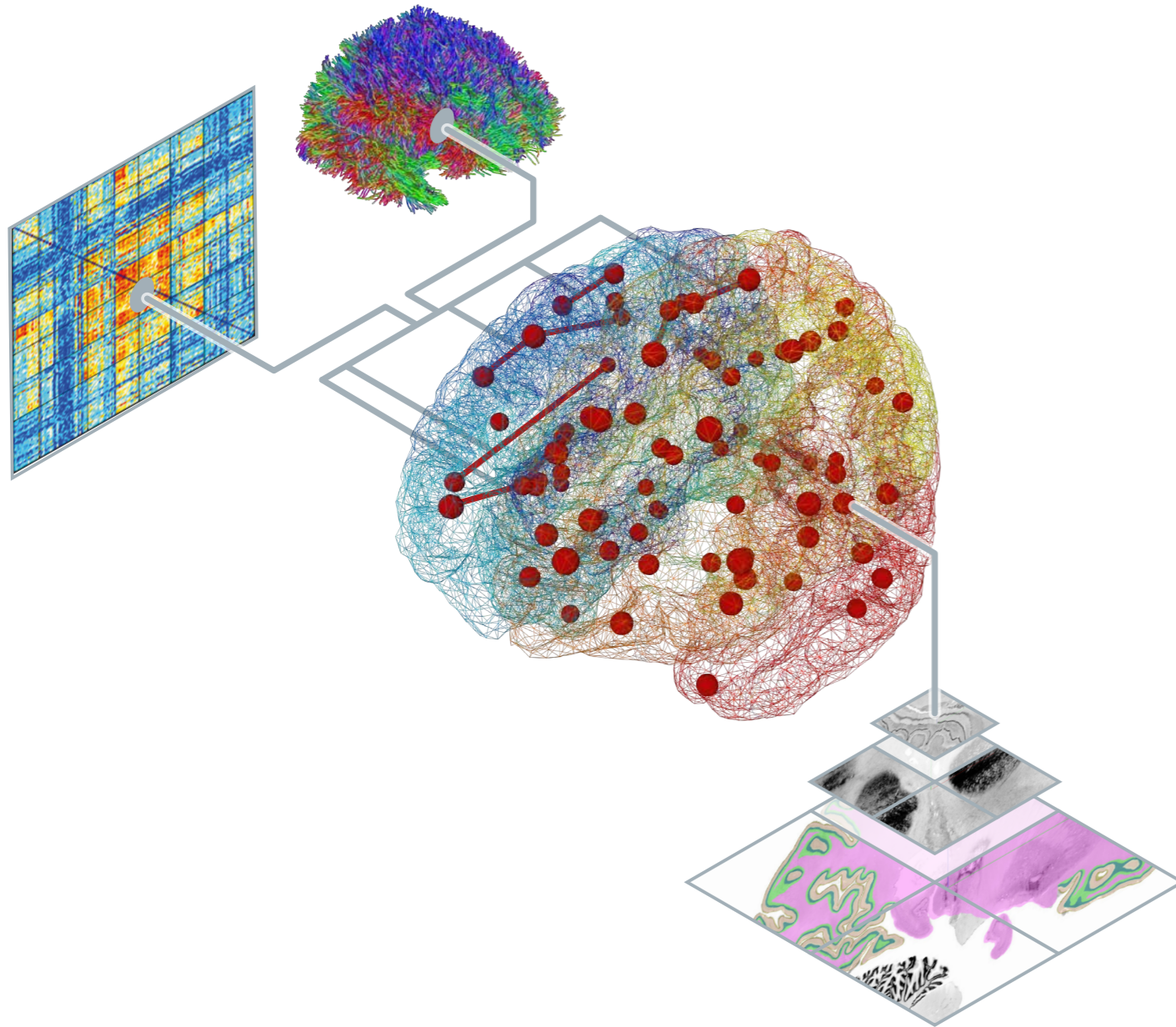
Mouse hippocampus CA1
~1'000 compartments/neuron,
1" of sim time takes 5hr on BG/Q
(runs on JUQUEEN) with 32000 procs
produces 4TB of output data
Migliore et al., Palermo, SP6



Institut de
Neurosciences
des Systèmes

IN CONCLUSION

Final thoughts



The Virtual Brain closes the gap between model and brain imaging.

Personalized in-silico brain modeling platforms enable search for novel clinical solutions.

EBRAINS provides an ecosystem, in which a new form of scientific ('industrialized') collaboration is possible.

McIntosh AR & Jirsa VK (2019). The hidden repertoire of brain dynamics and dysfunction. *Network Neuroscience*, 3(4), 994–1008

Jirsa VK (2020) Structured Flows on Manifolds as guiding concepts in brain science.

In: Viol K., Schöllner H., Aichhorn W. (eds) *Selbstorganisation - ein Paradigma für die Humanwissenschaften*. Springer



Institut de
Neurosciences
des Systèmes

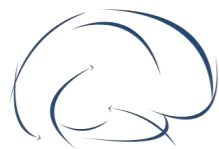
THANK YOU

Randy McIntosh
Petra Ritter
Jochen Mersmann
Gustavo Deco
Alain Destexhe
Günter Schiepek

Fabrice Bartolomei
Maxime Guye
Christian Bénar
Julia Scholly
Christophe Bernard
Fabrice Wendling

Marmaduke Woodman
Huifang Wang
Spase Petkoski
Demian Battaglia
Julie Courtiol
Jan Fousek

Meysam Hashemi
Viktor Sip
Jayant Jha
Anirudh Nihalani Vattikonda
Kashyap Gudibanda
Lionel Kusch



Institut de
Neurosciences
des Systèmes



THANK YOU



EBRAINS



