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A full-scale spiking model of the local cortical network

Markus Diesmann

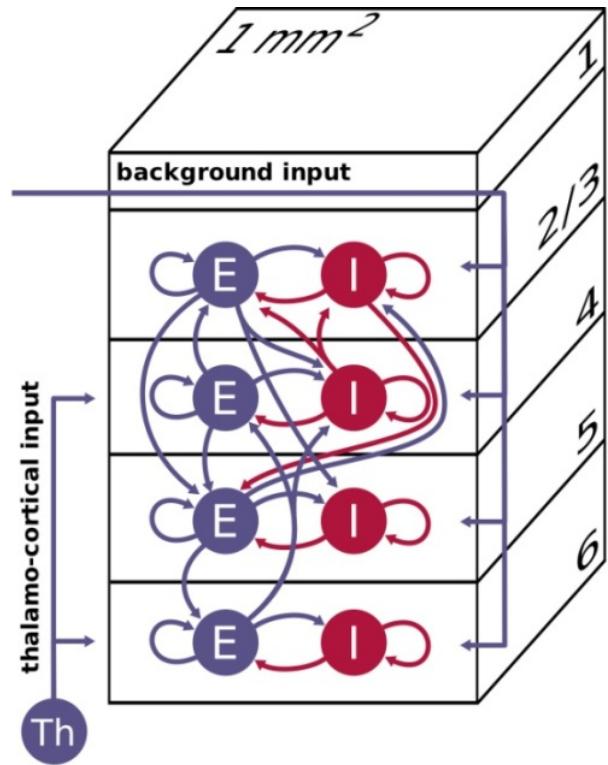
Institute of Neuroscience and Medicine (INM-6)
Institute for Advanced Simulation (IAS-6)
Jülich Research Centre

Outline

- construction of local cortical network model
- stationary state
- target specificity
- transients and a hypothesis
- critique of local network models
- necessity of brain-scale models
- enabling dissemination of the model

Minimal layered cortical network model

- extending the successful 2 population model
- understand impact of structure on observed dynamics
- explain cell type specific spike rates
- main work by Tobias C Potjans



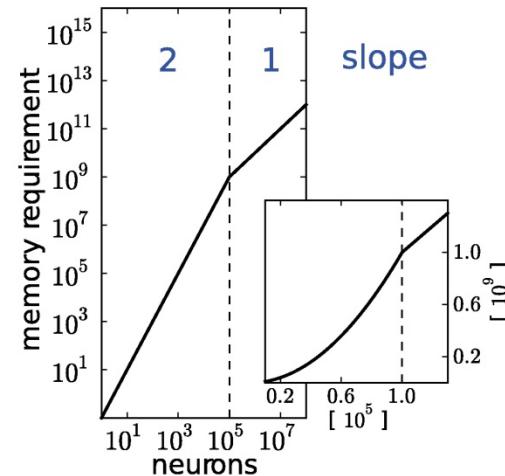
Potjans TC & Diesmann M (2014) The cell-type specific connectivity of the local cortical network explains prominent features of neuronal activity. *Cerebral Cortex* 24 (3): 785-806

Feasibility and structural constraints

- connectivity $c = 0.1$
- synapses per neuron $= 10^4$
- ⇒ minimal network size $= 10^5$

network $N = 10^5$

- **considered elementary unit**
- corresponding to 1 mm^3



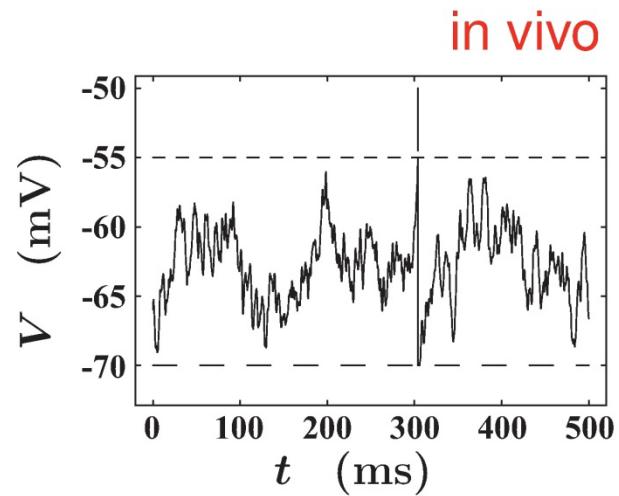
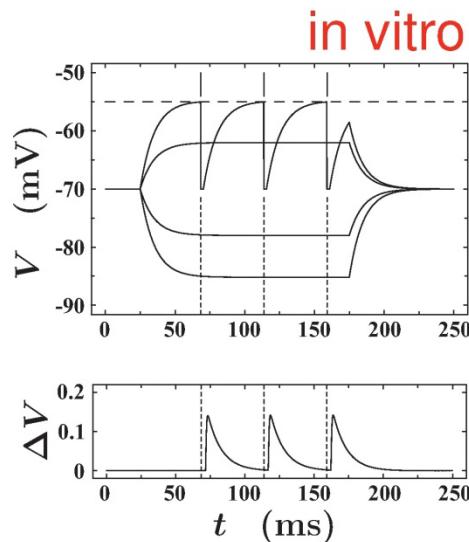
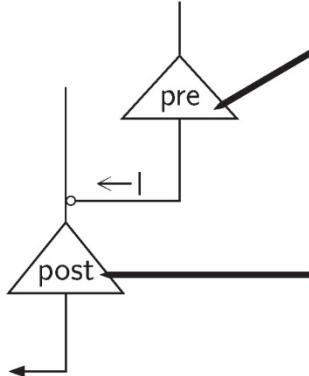
⇒ possible

$$\text{total number of synapses} = (cN) \cdot N$$

Morrison, Mehring, Geisel, Aertsen, Diesmann (2005) *Neural Computation* 17:1776–1801

Morrison, Straube, Plessner, Diesmann (2007) *Neural Computation* 19:47–79

Fundamental interactions

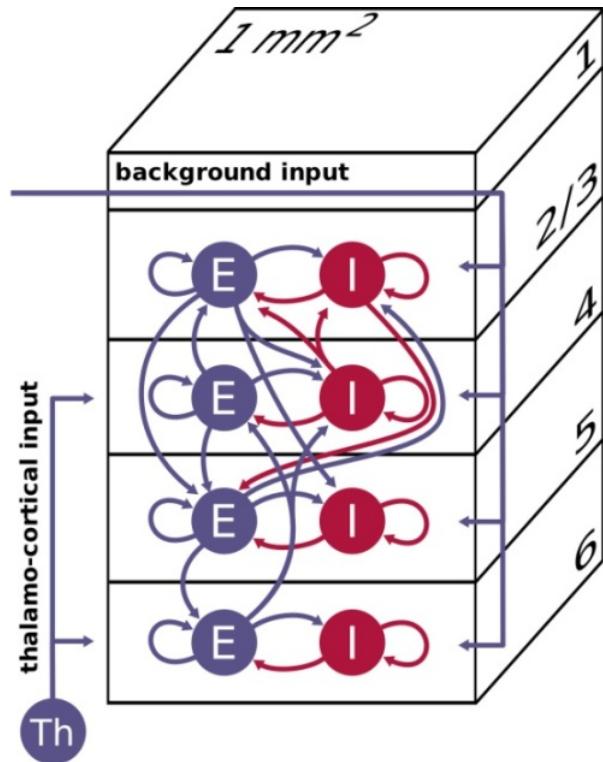


- current injection into pre-synaptic neuron causes excursions of membrane potential
- supra-threshold value causes spike transmitted to post-synaptic neuron
- post-synaptic neuron responds with small excursion of potential after delay
- inhibitory neurons (20%) cause negative excursion

- each neuron receives input from 10,000 other neurons
- causing large fluctuations of membrane potential
- emission rate of 1 to 10 spikes per second

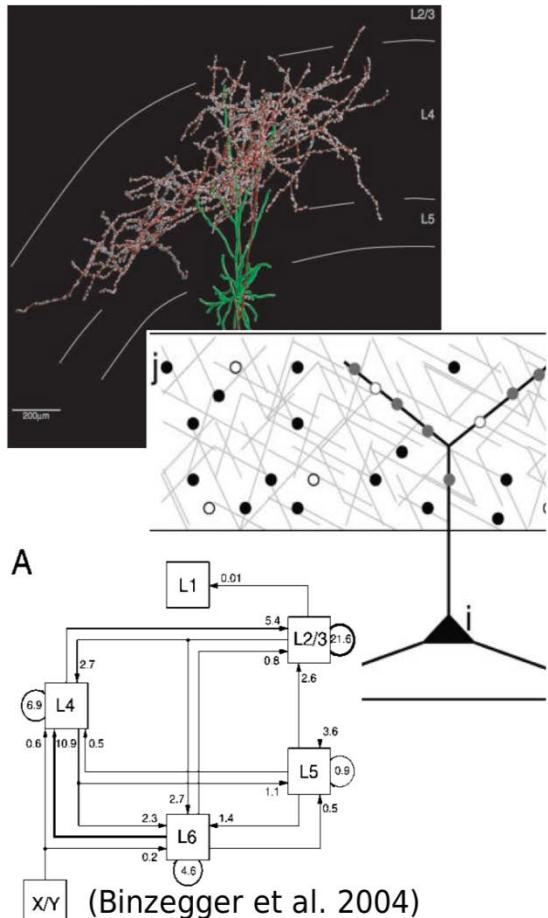
Minimal layered cortical network model

- 1 mm³
- 1 billion synapses, 100,000 neurons
- 2 populations of neurons (E,I) per layer
- E and I identical neuronal dynamics
- laterally homogeneous connectivity
- layer- and type-specific C_{ij}^{xy}

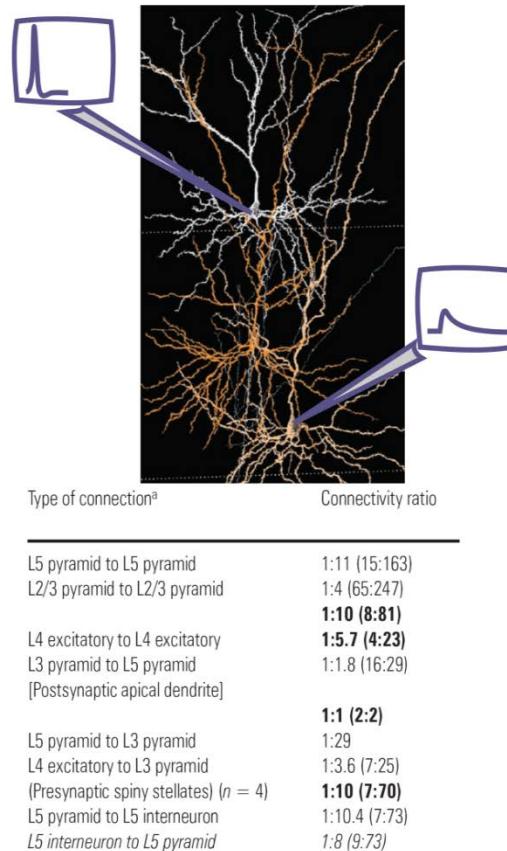


Anatomical data sets

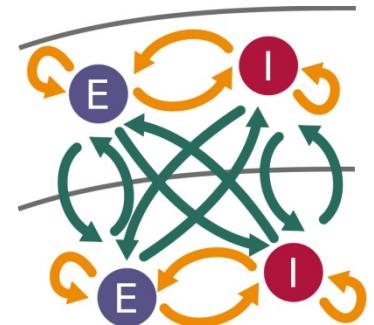
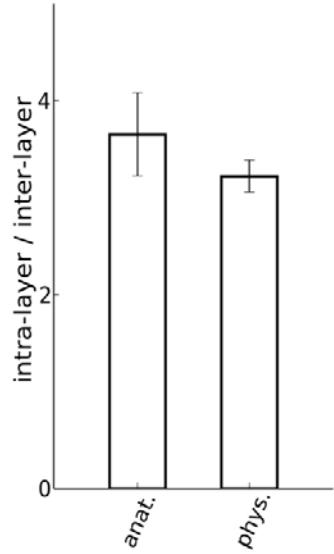
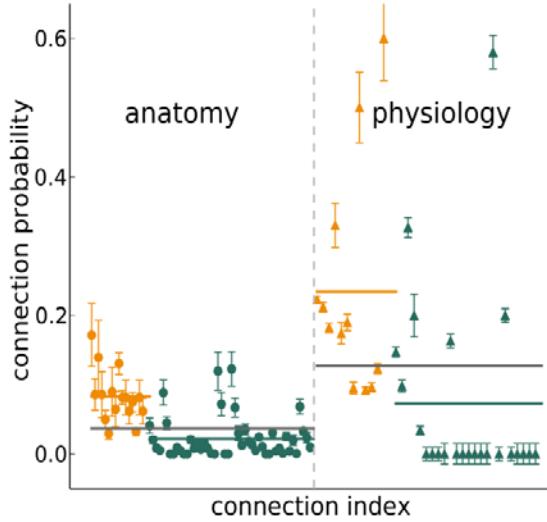
in vivo anatomy



in vitro physiology

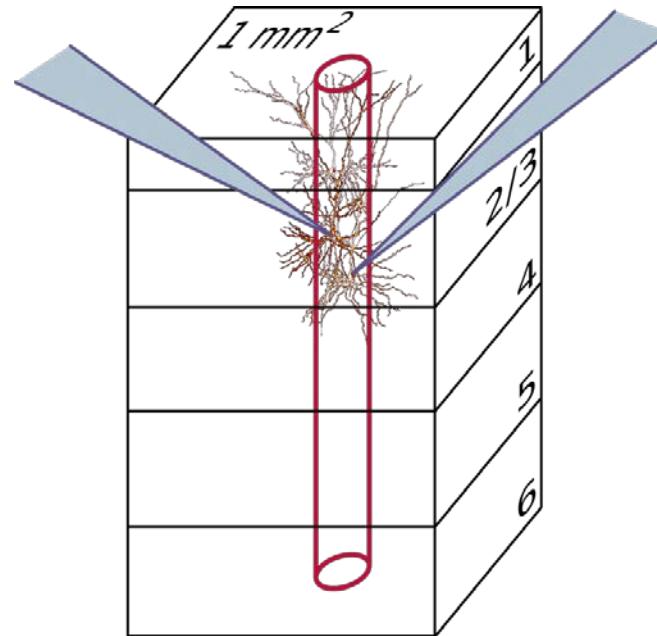
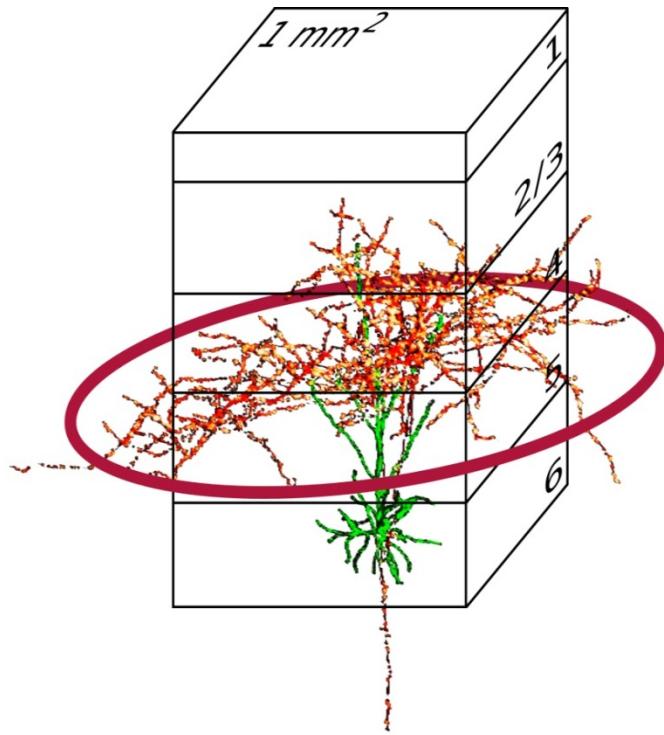


Consistency of connection probabilities



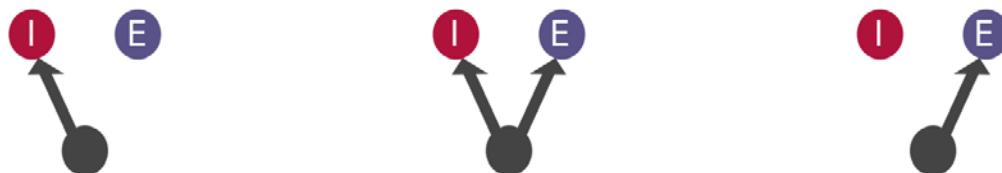
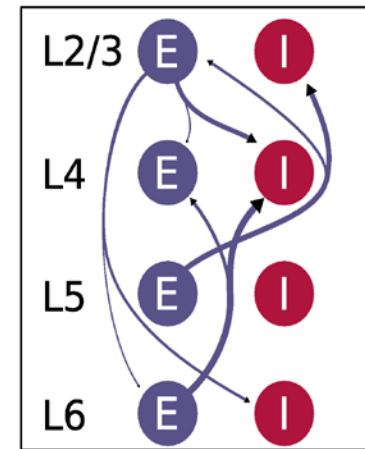
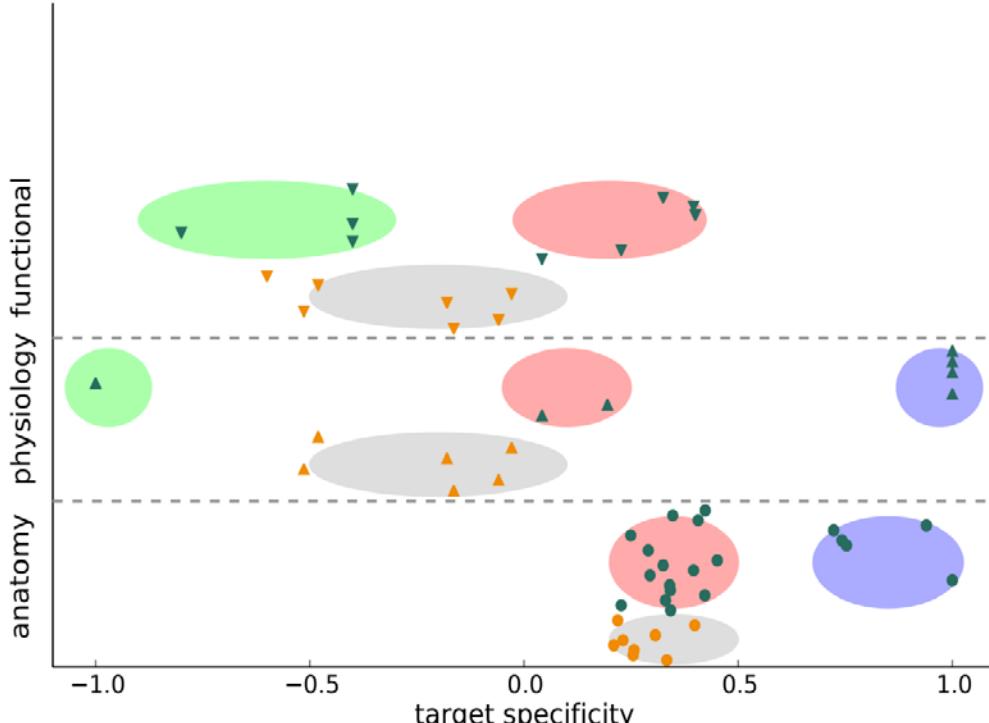
- yellow within layer, green across
- inconsistent averages
- consistent architectural relations

Lateral connectivity



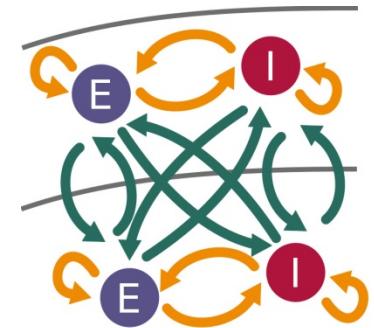
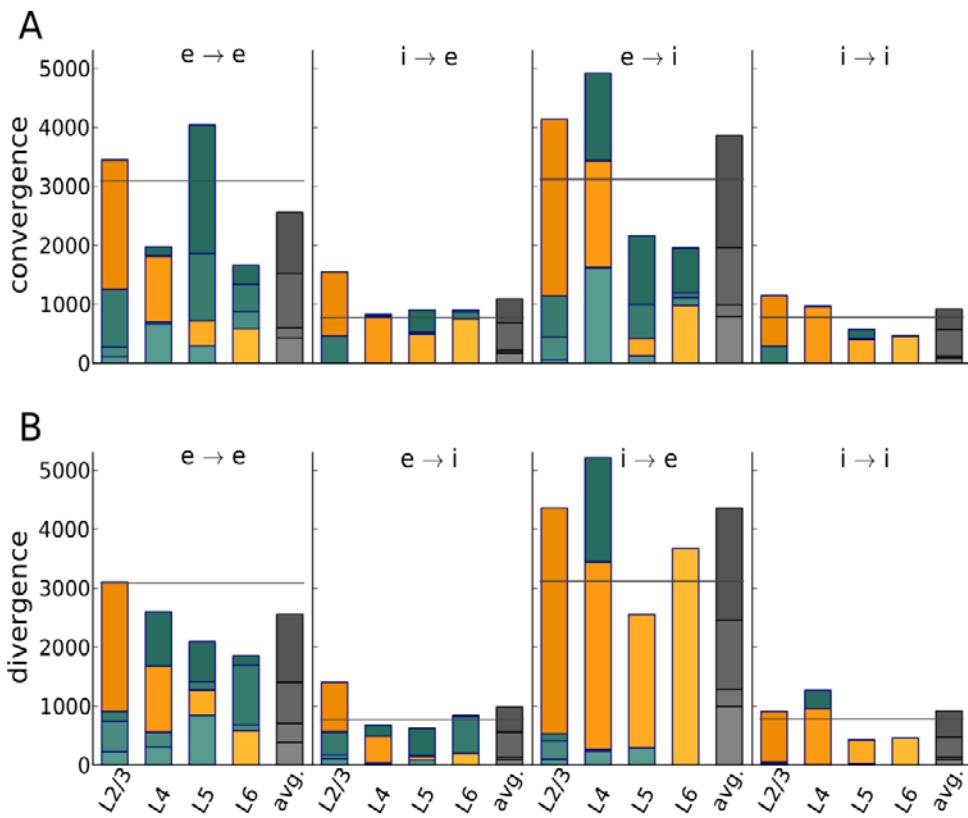
- correction for sampling radius using Gaussian model of distance dependents

Target specificity



- correction for bias in anatomical method

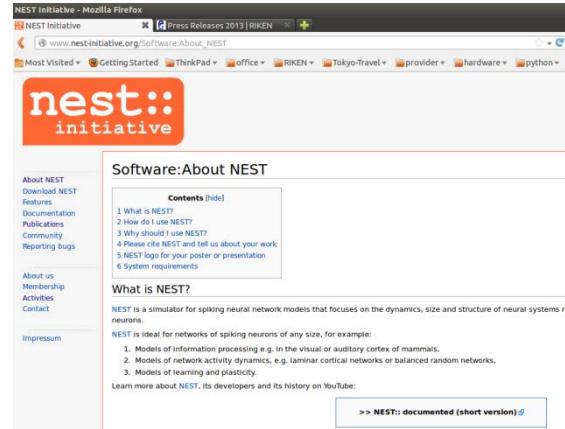
Convergence and divergence



- dominated by within-layer connections
- e → e divergence reflects "standard" loop
- e → i divergence reflects target-specific feedback

Simulation Technology: the NEST Initiative

collaborative effort and community building



The screenshot shows a Mozilla Firefox browser window with the NEST Initiative website loaded. The title bar says 'NEST Initiative - Mozilla Firefox'. The main content area is titled 'Software:About NEST'. It features a sidebar with links like 'About NEST', 'Download NEST', 'Features', 'Documentation', 'Publications', 'Community', 'Reporting bugs', 'About us', 'Membership', 'Activities', 'Contact', and 'Impressum'. The main content includes sections on 'What is NEST?' and 'Models of learning and plasticity', along with a link to a documented short version.

- origins in 1994, collaboration of several labs (since 2001)
- registered society (since 2012)
- teaching in international advanced courses:
 - Okinawa Computational Neuroscience Course OCNC, Japan
 - Advanced Course in Computational Neuroscience ACCN, Europe
 - Latin American School on Computational Neuroscience LASCON, South America

- core technology of  Human Brain Project

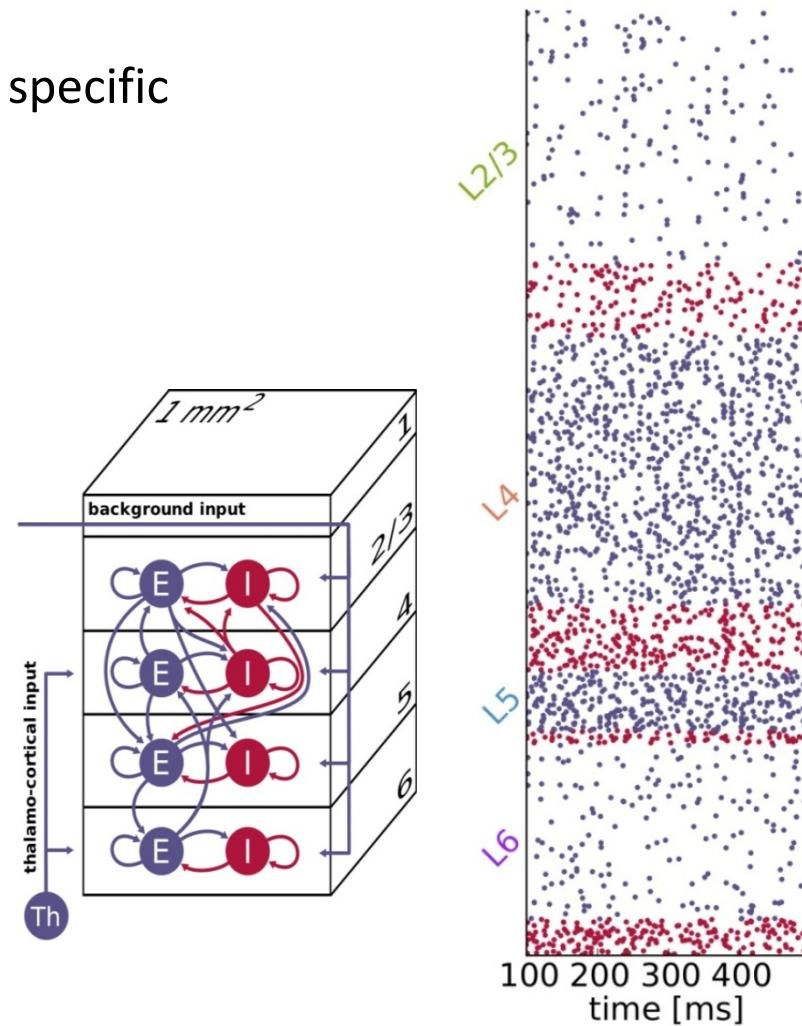
e.g.: Morrison, ..., Diesmann (2005) *Neural Computation*

Zaytsev, Morrison (2013) *Frontiers in Neuroinformatics*

Local cortical microcircuit

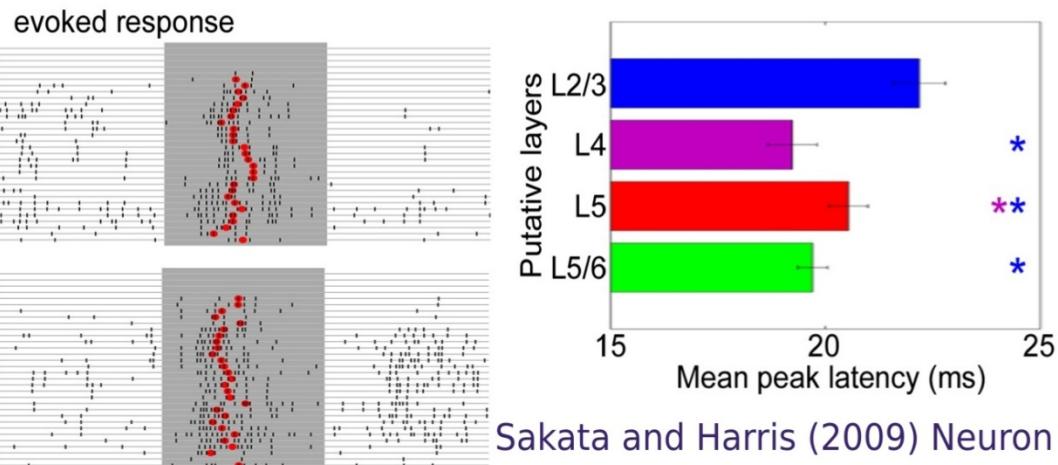
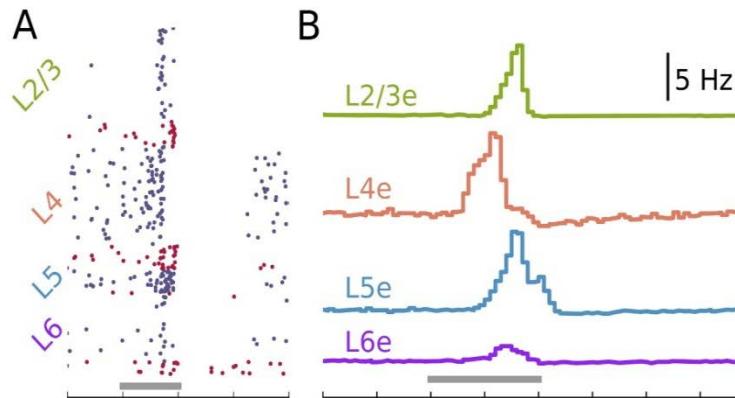
taking into account layer and neuron-type specific connectivity is sufficient to reproduce experimentally observed:

- asynchronous-irregular spiking of neurons
- higher spike rate of inhibitory neurons
- correct distribution of spike rates across layers



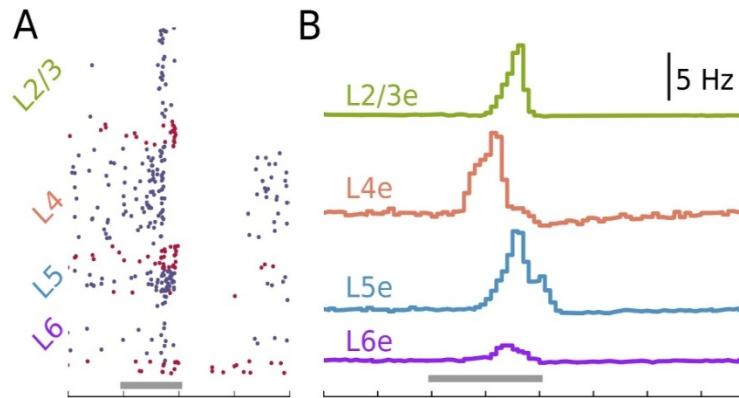
Potjans TC & Diesmann M (2014) The cell-type specific connectivity of the local cortical network explains prominent features of neuronal activity. *Cerebral Cortex* 24 (3): 785-806

Response to transient inputs

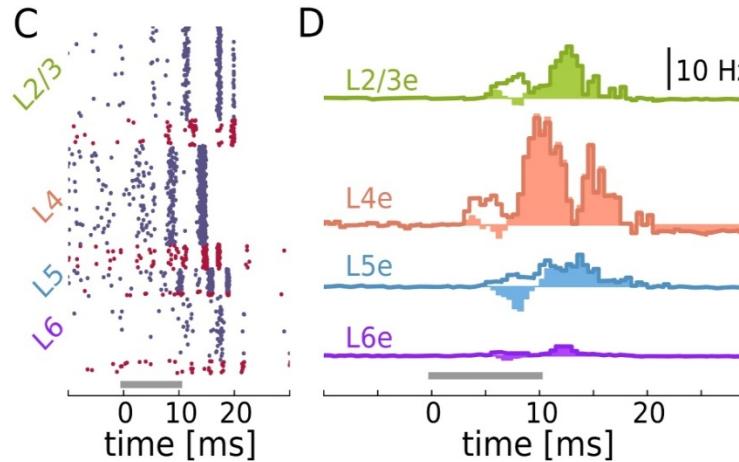


Response to transient inputs

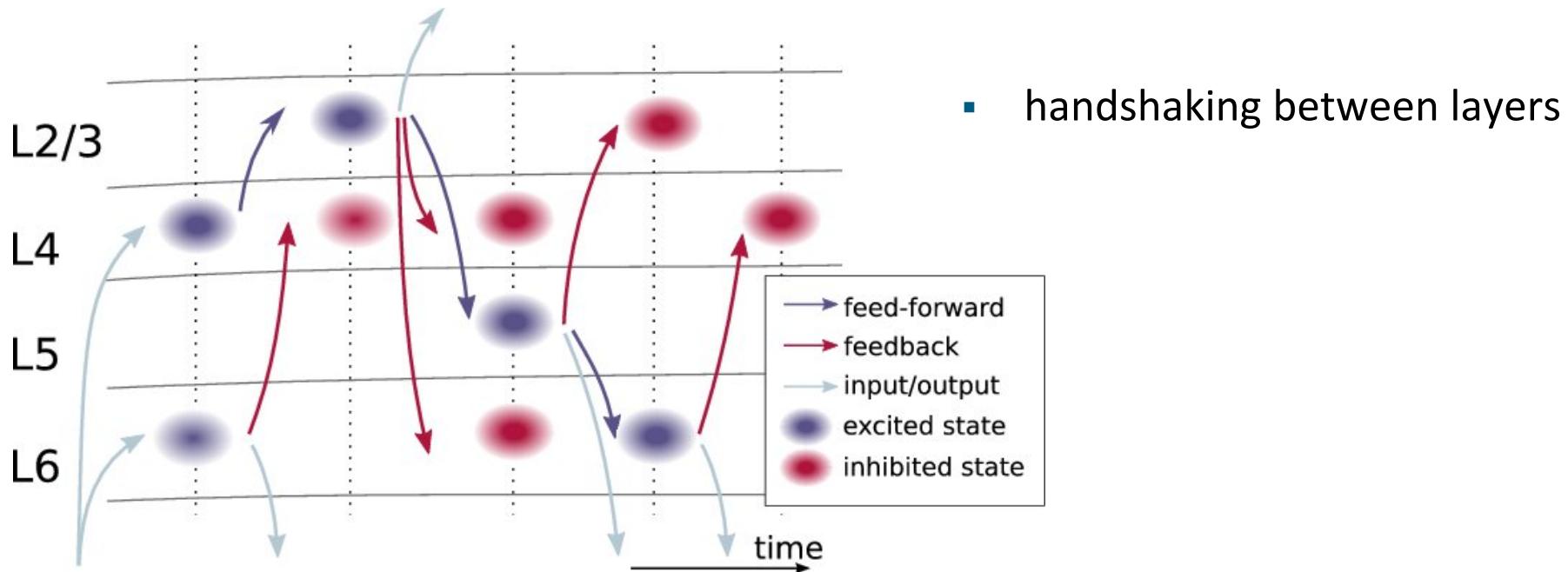
■ $T = -0.4$



■ $T = +0.4$

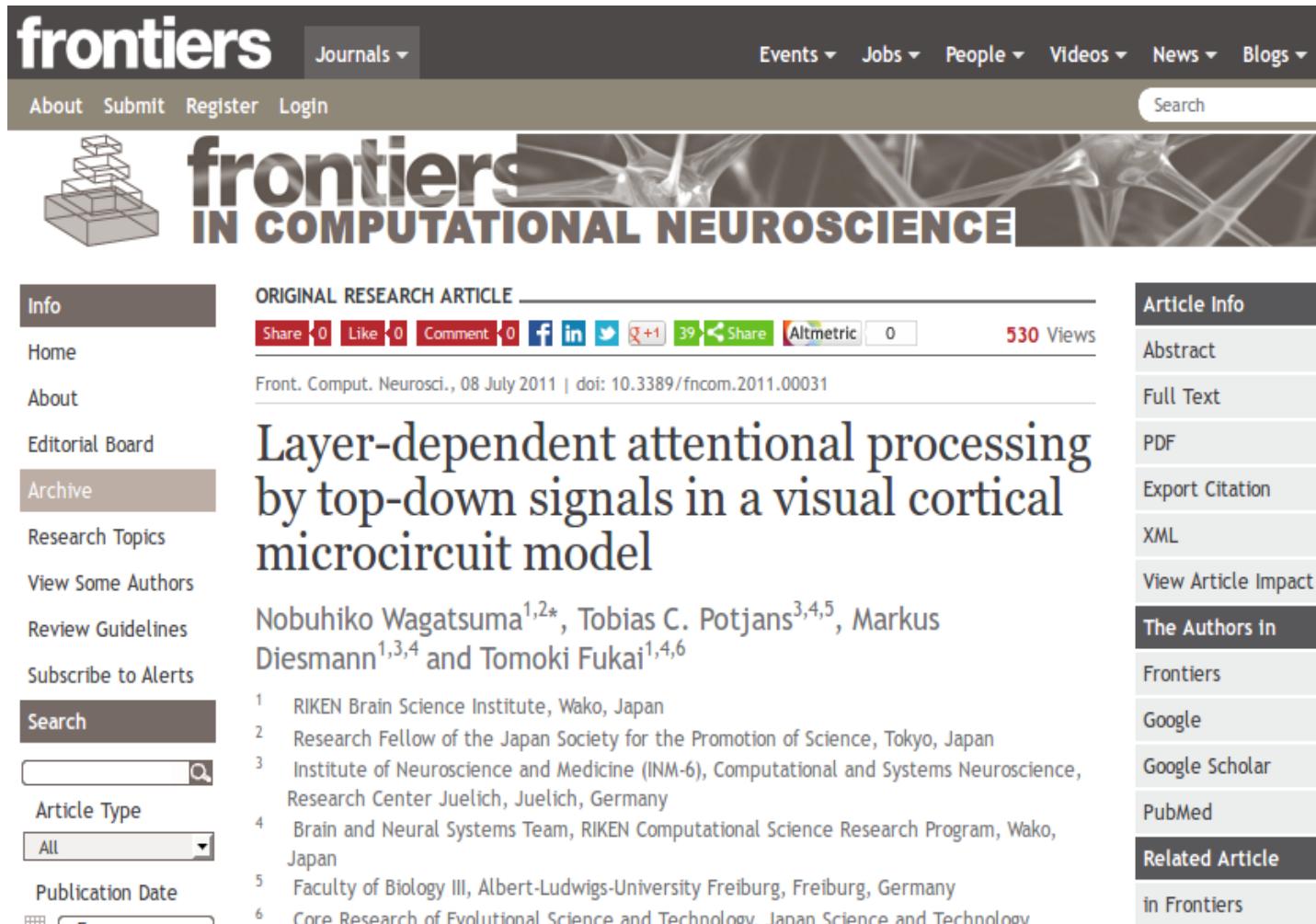


Hypothesis on cortical flow of activity



Potjans TC & Diesmann M (2014) The cell-type specific connectivity of the local cortical network explains prominent features of neuronal activity. *Cerebral Cortex* 24 (3): 785-806

Building block for functional studies



The screenshot shows the frontiers IN COMPUTATIONAL NEUROSCIENCE website. The main header features the journal logo (a stylized brain) and the title 'frontiers IN COMPUTATIONAL NEUROSCIENCE'. The navigation bar includes links for Journals, Events, Jobs, People, Videos, News, and Blogs. Below the header, there are links for About, Submit, Register, Login, and a search bar. The main content area displays an 'ORIGINAL RESEARCH ARTICLE' by Nobuhiko Wagatsuma, Tobias C. Potjans, Markus Diesmann, and Tomoki Fukai. The article title is 'Layer-dependent attentional processing by top-down signals in a visual cortical microcircuit model'. The abstract, full text, PDF, and citation export options are available on the right. The left sidebar contains links for Info (Home, About, Editorial Board, Archive, Research Topics, View Some Authors, Review Guidelines, Subscribe to Alerts), Search (with a search bar and dropdown menu for Article Type: All), and Publication Date.

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IN COMPUTATIONAL NEUROSCIENCE

ORIGINAL RESEARCH ARTICLE

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Front. Comput. Neurosci., 08 July 2011 | doi: 10.3389/fncom.2011.00031

Layer-dependent attentional processing by top-down signals in a visual cortical microcircuit model

Nobuhiko Wagatsuma^{1,2*}, Tobias C. Potjans^{3,4,5}, Markus Diesmann^{1,3,4} and Tomoki Fukai^{1,4,6}

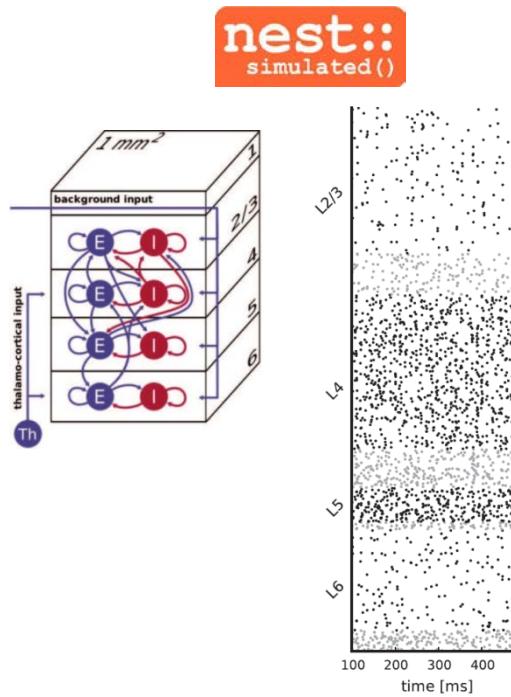
¹ RIKEN Brain Science Institute, Wako, Japan
² Research Fellow of the Japan Society for the Promotion of Science, Tokyo, Japan
³ Institute of Neuroscience and Medicine (INM-6), Computational and Systems Neuroscience, Research Center Juelich, Juelich, Germany
⁴ Brain and Neural Systems Team, RIKEN Computational Science Research Program, Wako, Japan
⁵ Faculty of Biology III, Albert-Ludwigs-University Freiburg, Freiburg, Germany
⁶ Core Research of Evolutional Science and Technology, Japan Science and Technology

Article Info

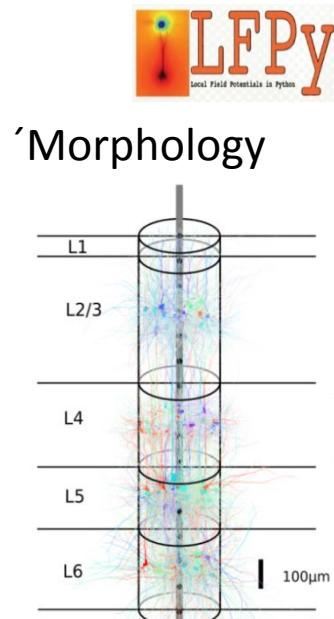
Abstract Full Text PDF Export Citation XML View Article Impact The Authors In Frontiers Google Google Scholar PubMed Related Article in Frontiers

Building block for mesoscopic studies

- David Dahmen, Jannis Schücker, Tom Tetzlaff
- in EU BrainScaleS with Gaute Einevoll (UMB, Norway)

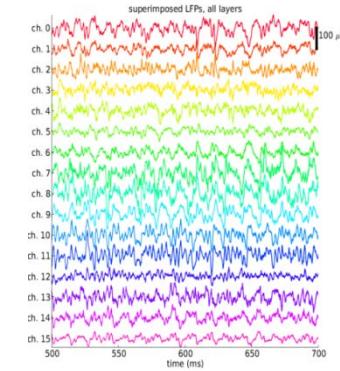


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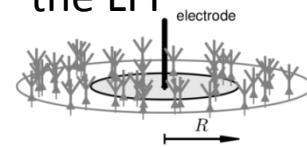


NEURON
for empirically-based simulations of neurons and networks of neurons

Laminar LFP profile



Spatial reach of the LFP



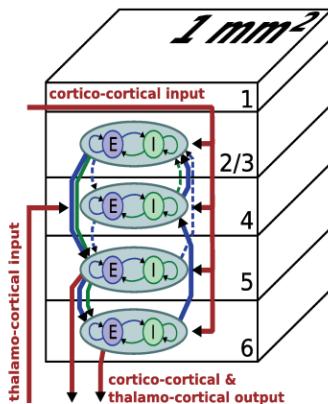
Linden H, Tetzlaff T, Potjans TC, Pettersen KH, Grün S, Diesmann M, Einevoll GT (2011) Modeling the spatial reach of the LFP. *Neuron* 72(5):859-872

Critique of local network models

Local Cortical Network

Connections:

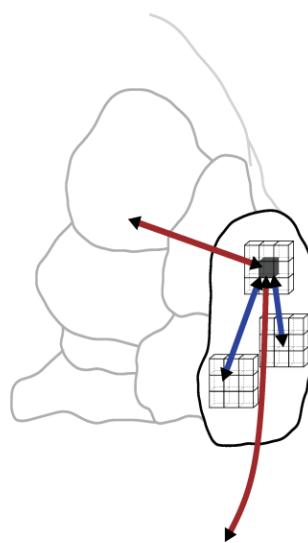
- ✓ local connections
- ✓ realistic synaptic modeling
- ✗ a major part of synapses missing
- ⇒ input dependent local network dynamics



Cortical Area Network

Connections:

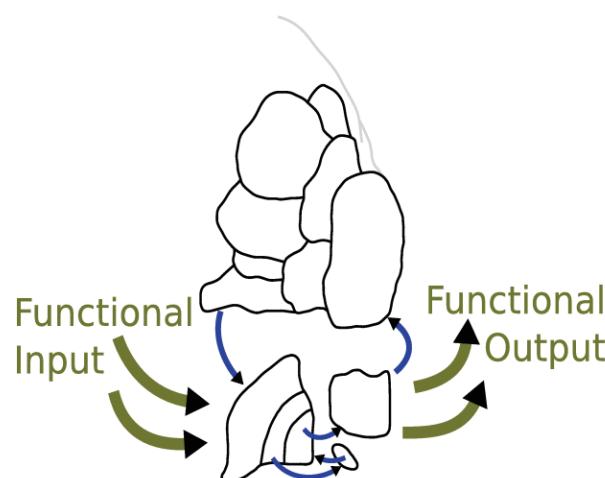
- ✓ intrinsic connections
- ✗ many synapses missing



Brain-scale

Connections:

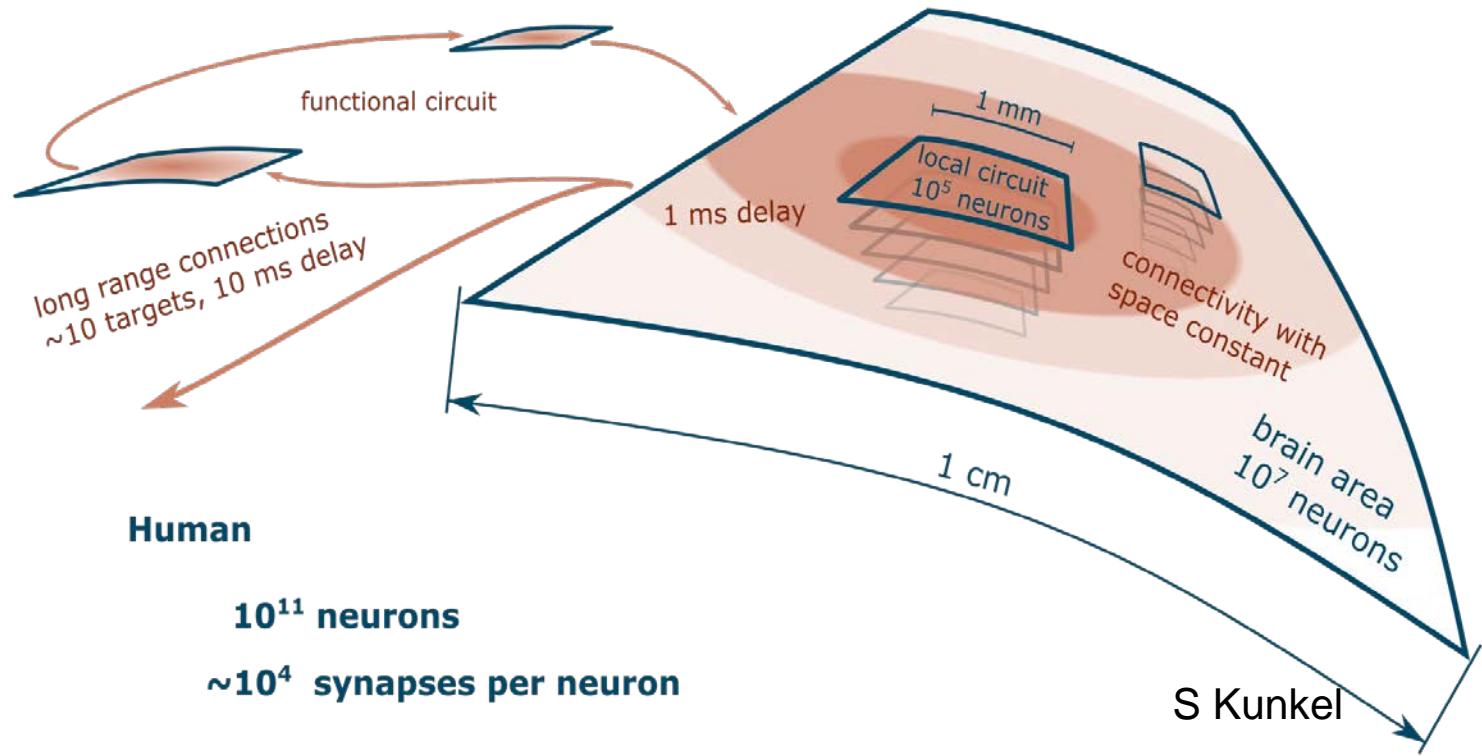
- ✓ all connections
- ⇒ bottom-up and top-down approach meet on this level



Brain and Neural Systems Team, RIKEN Computational Science Research Program
Pilot study: jinb33 (2008) Jugene *Brain-scale simulations* FZ Juelich

Brain-scale connectivity

a network of networks with at least three levels of organization:



- neurons in local microcircuit models are missing 50% of synapses
- e.g., power spectrum shows discrepancies, slow oscillations missing
- solution by taking brain-scale anatomy into account

Meso- and macro-scale measures

brain-scale networks
provide the substrate for

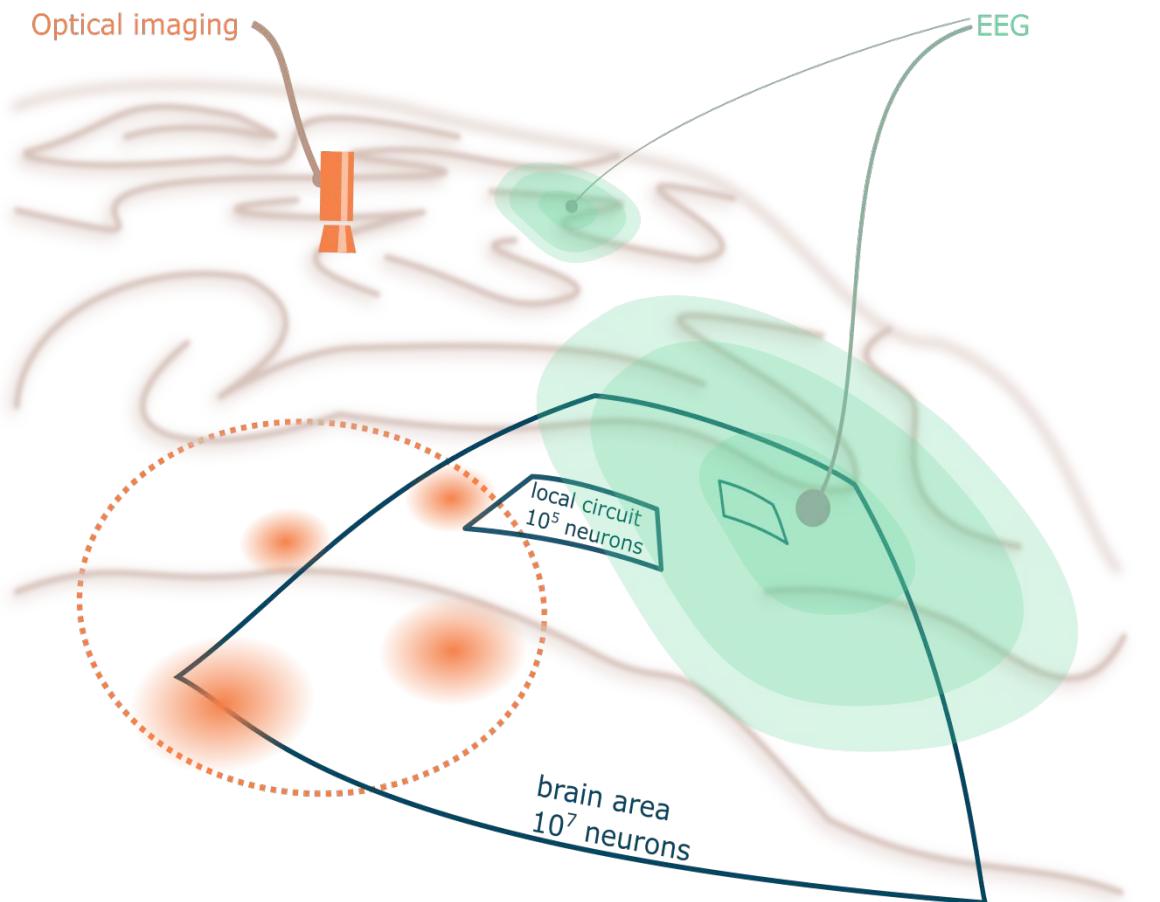
mesoscopic measures

- local field potential (LFP)
- voltage sensitive dyes (VSD)

and macroscopic measures

- EEG, MEG
- fMRI resting state networks

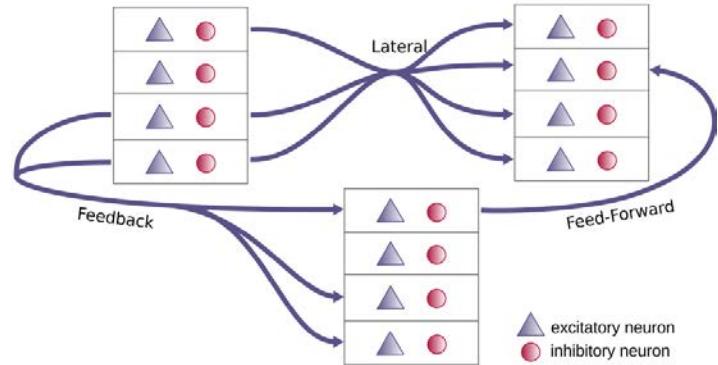
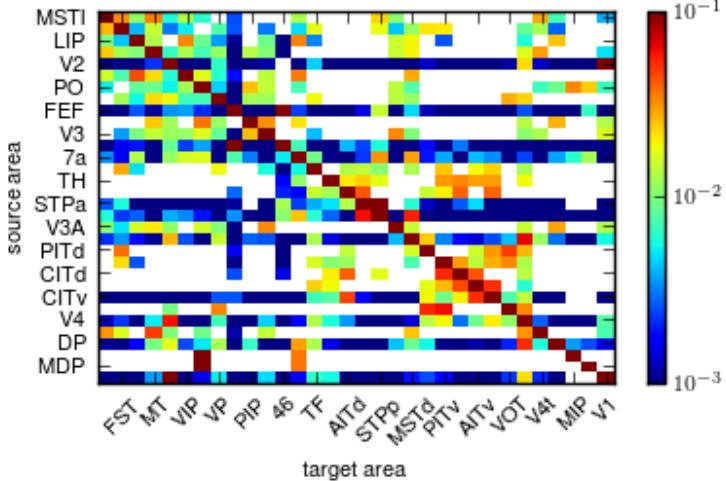
connecting biophysical modeling to the field of neuroimaging



S Kunkel



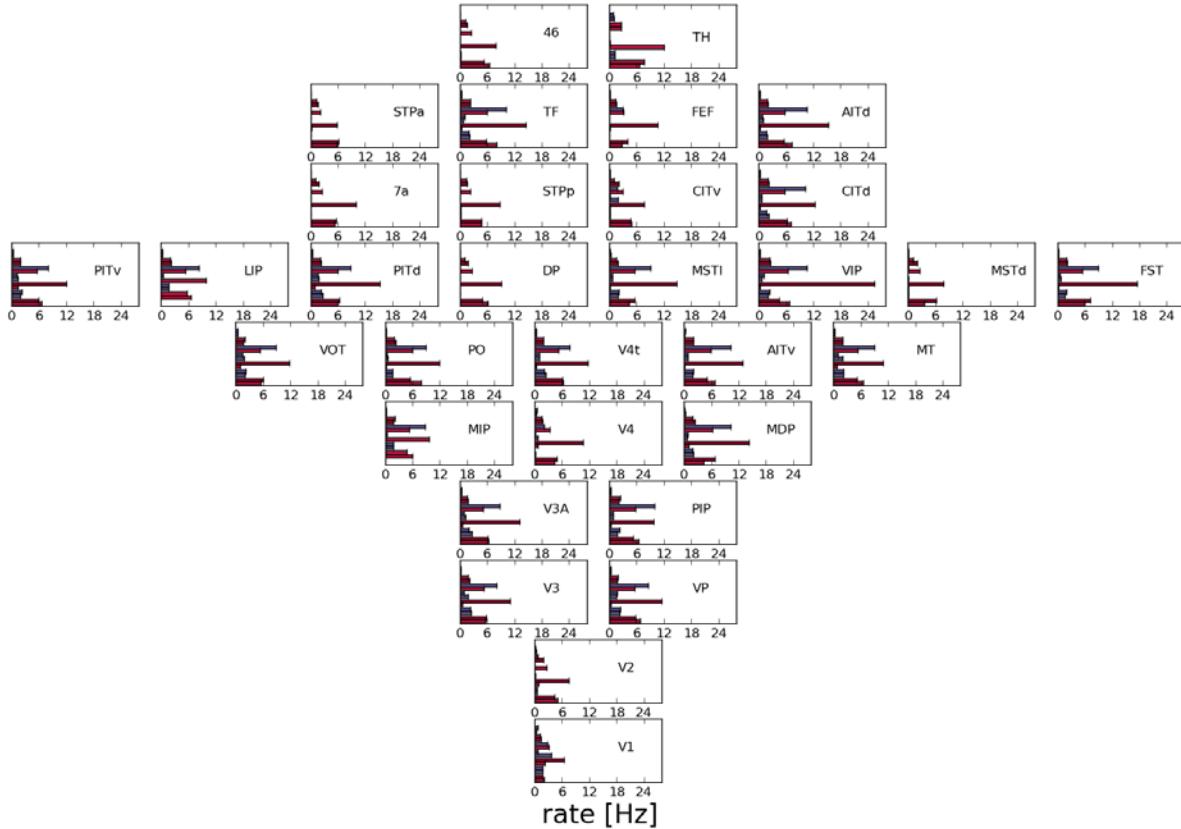
Multi-area model of macaque visual cortex



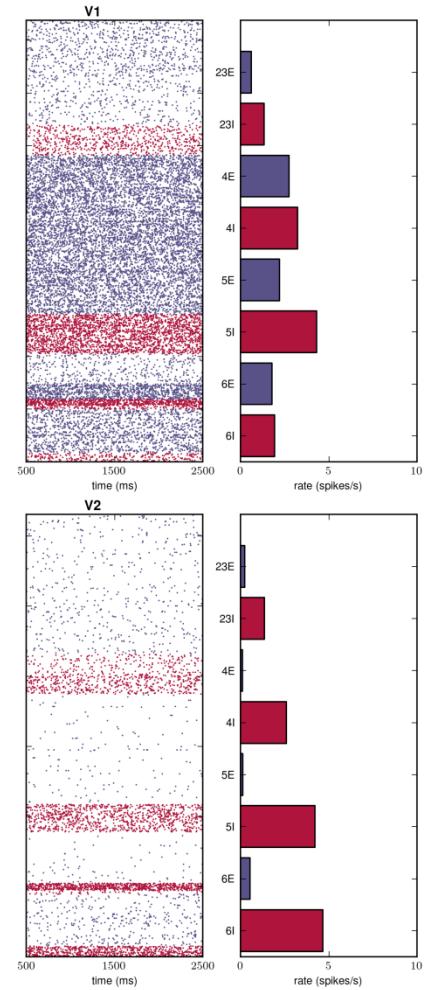
- matrix shows in-degree onto target areas in relative proportions
- data from CoCoMac database (Rembrandt Bakker curator) enriched by quantitative data from Kennedy lab (Markov et al., 2012)
- model enables iterative data integration
- macroscopic connectivity data for macaque visual cortex most complete
- prototype for human brain
- model 1: cubic millimeter multi-layered microcircuits connected by inter-area network
- model 2: realistic relative size of cortical areas
- model 3: full-scale

Multi-area model of macaque visual cortex

- Max Schmidt, Sacha van Albada, Rembrandt Bakker

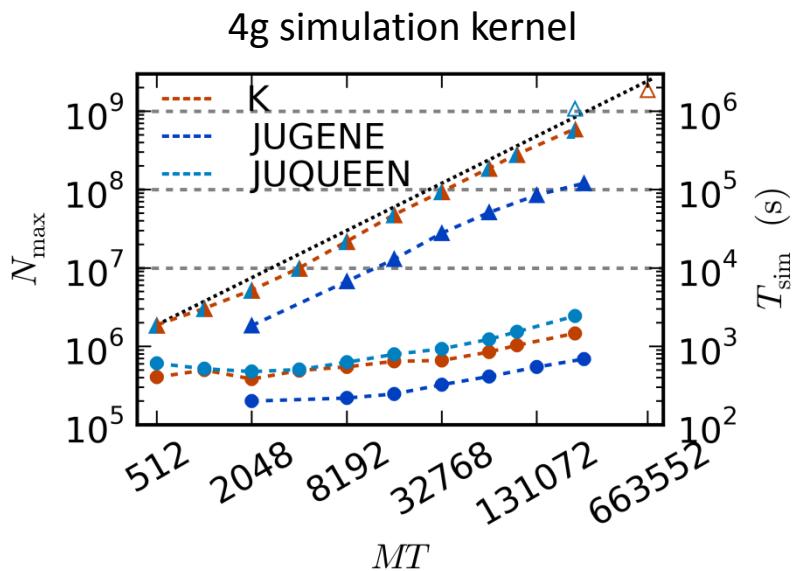


Population-specific firing rates with areas arranged according to Felleman and Van Essen hierarchy



Record simulation 2013

- largest simulation to date
- scales to largest computers (petascale)
- worst case scenario: random network
- well picked up by media
- manuscript in preparation
- MoU with RIKEN AICS in Kobe



future plans (HBP ramp-up phase):

- release 4g simulation kernel for production

future plans (HBP operational phase):

- exploit massive parallelism of processors
- develop communication architecture for exascale systems
- develop and promote interactive supercomputing



Human Brain Project

A new connection routine

Obstacles so far:

- No published connection routine in NEST or PyNN which randomly connects the neurons of two populations given the total number of connections.
- No flexibility in choosing the distribution of the synapse parameter which allowed for connecting a large network in an adequate time span.

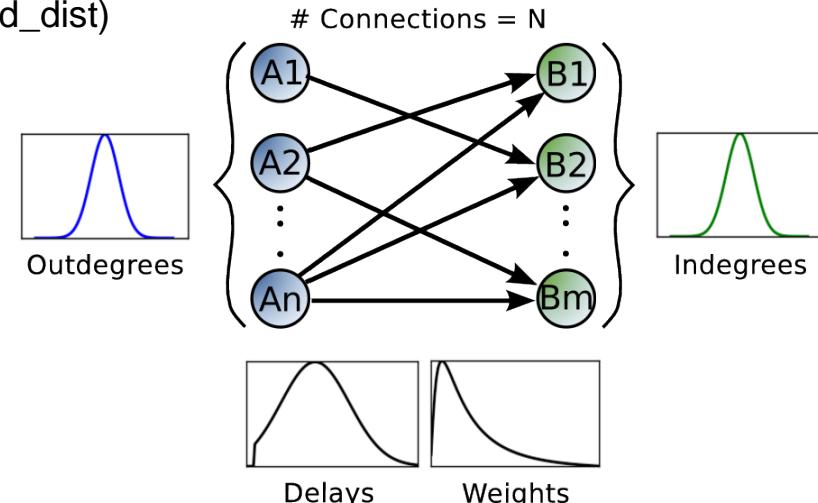
`nest.Connect()` and its relation to PyNN:

- Connection-rule can be chosen from a dictionary of pre-defined connectivity patterns.
 - Most patterns are parallelized using MPI and OpenMP.
- Synapse parameter can be randomized via numerous pre-defined random distributions.
 - Evaluation of random distribution is passed on to the C++-level.
- Usage of common terminology of synapse parameters and distributions in PyNN and NEST.
- Implementation of `FixedTotalNumberConnector` in PyNN.

Connecting the microcircuit

Connecting two excitatory populations with PyNN:

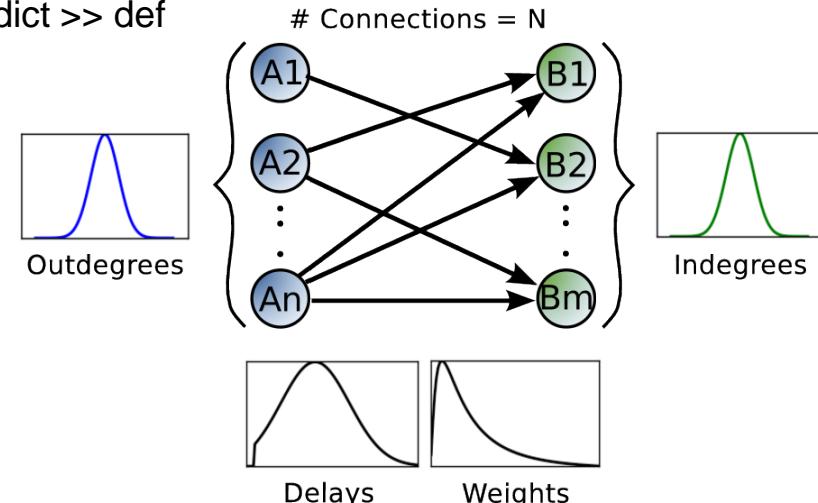
- Initialize the connector with the number of synapses going from pop1 to pop2.
 » `conn = sim.FixedTotalNumberConnector(n_syn)`
- Set the parameters for the weight and delay distribution.
 » `d_dist = sim.random.RandomDistribution('normal_clipped', [d_m, d_sd, 0.1, np.inf])`
 » `w_dist = sim.random.RandomDistribution('normal_clipped', [w_m, w_sd, 0., np.inf])`
- Initialize the synapse with the weight and delay distributions.
 » `syn = sim.StaticSynapse(weight=w_dist, delay=d_dist)`
- Create the projection from pop1 to pop2.
 » `proj = sim.Projection(pop1,pop2,conn,syn)`



Connecting the Microcircuit

Connecting two excitatory populations with SLI:

- Specify the connectivity pattern and the total number of connections.
 » /conn_dict << /rule /fixed_total_number /N n_syn>> def
- Initialize the weight and delay distributions.
 » /weight_dict << /distribution /lognormal_clipped /mu w_m /sigma w_sd /min 0.0 >> def
 » /delay_dict << /distribution /normal_clipped /mu d_m /sigma d_sd /min 0.1 >> def
- Insert the weight and delay distributions into the synapse dictionary.
 » syn_dict << /weight weight_dict /delay delay_dict >> def
- Connect pop1 with pop2.
 » sources targets conn_dict syn_dict NewConnect



Summary

- model of local cortical network explains cell type specific spike rates
- importance of target specificity
- proposal of handshake mechanism between layers
- already in use as a building block in further studies
- need for brain-scale models
- difficulty of instantiating the model with general purpose simulator
- distributed parameters as a high-level concept
- implemented in next coordinated release of NEST and PyNN
- including open source SLI and PyNN versions of model