



TOWARDS A TOPOLOGICAL UNDERSTANDING OF SYNAPTIC PLASTICITY

Abel Symposium

Geiranger

6 June 2018

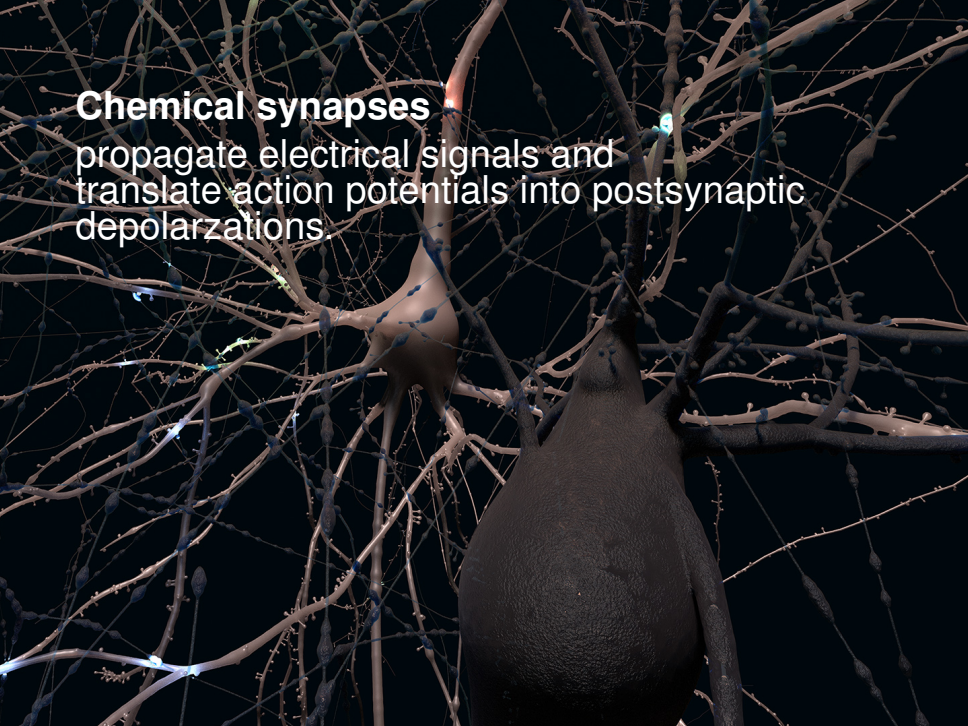




Synaptic plasticity
for the working topologist

Chemical synapses

propagate electrical signals and translate action potentials into postsynaptic depolarizations.





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Synaptic plasticity

is the capability to dynamically adjust the read-out of pre- and post-synaptic state.

SIGNAL TRANSMISSION

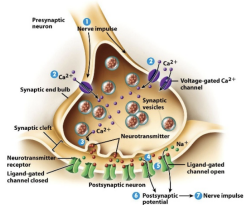
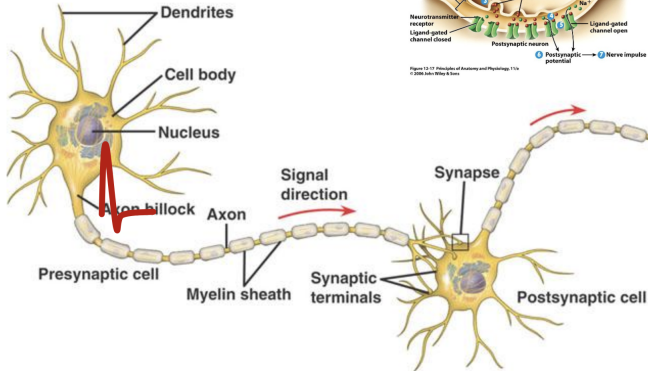


Figure 13.17 Principles of Anatomy and Physiology, 11e © 2008 John Wiley & Sons

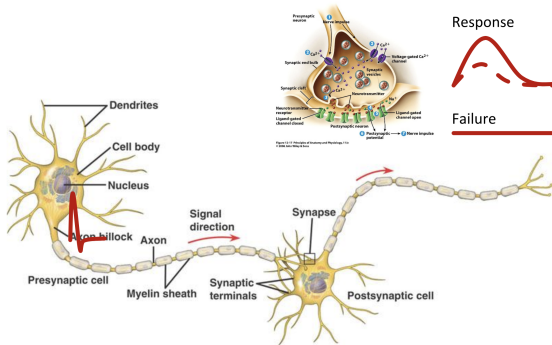
Response



Failure



SIGNAL TRANSMISSION



From pmgbiology.com

- Vesicle release is stochastic.
- Plasticity leads to creation and removal of post-synaptic receptors.
- NMDA receptors act as “coincidence detectors” for pre- and post-synaptic activity.

FORMS OF SYNAPTIC PLASTICITY

- **Depression:** decrease in synaptic “weight” caused by depletion of neurotransmitters at the axon terminal of a pre-synaptic neuron, associated with suppression of synapses
- **Potentiation:** increase in synaptic “weight” caused by influx of calcium into the axon terminal after spike generation, increasing the release probability of neurotransmitters, associated with creation of synapses

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Expands the range of dynamical behaviors and thus information-processing capacities beyond static connections:

- prolongs neural responses to transient inputs,
- modulates network responses to external input,
- induces network state mobility.

The substrate of learning and memory??

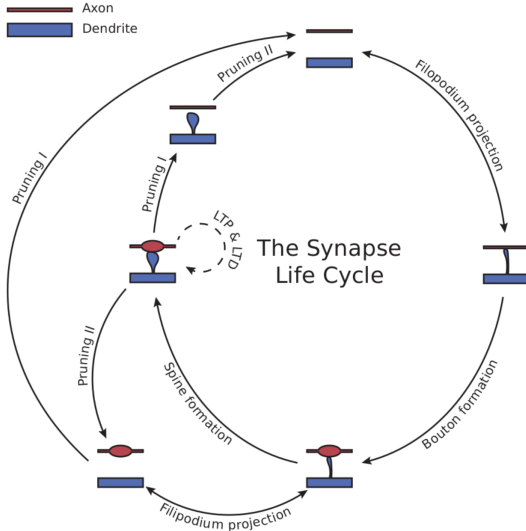
PHENOMENOLOGICAL MODEL

For each synapse and each time t , we consider

- A = absolute synaptic efficacy = maximum excitatory postsynaptic current produced by that synapse,
- $x(t) \in [0, 1]$: the fraction of available resources after neurotransmitter depletion,
- $u(t) \in [0, 1]$: the **release probability**.

$A \cdot u(t) \cdot x(t)$ = the synaptic current generated at the synapse
by a spike arriving at time t

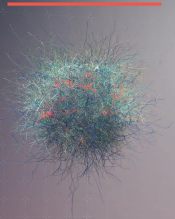
THE SYNAPSE LIFECYCLE



Plasticity of only a few pathways has been experimentally characterized!

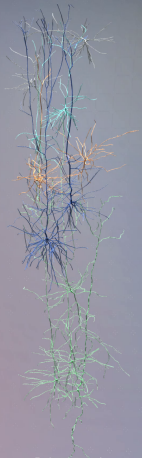
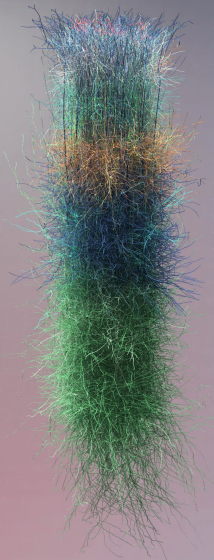
THE BLUE BRAIN MICROCIRCUIT

Blue Brain



Neuronal distribution in the rat somatosensory neocortex

Circuit: cxs1_v5.r0
Size: 31'346 neurons
Target: mc2_Column
Visualisation: 1'000 neurons
Coloring: per layer 1 to 6 and per synaptic class



Excitatory samples
-80% of neural cells are excitatory



Inhibitory samples
-20% of neural cells are inhibitory

1000µm

THE INCITE EXPERIMENT

[Chindemi, PhD thesis 2018]: Built and implemented a mathematical model of plasticity

- parametrizing all excitatory-to-excitatory synapses in the Blue Brain microcircuit (4 billion in total, 80% of all synapses),
- restricting to pre-synaptic changes as these seem to be the predominant plastic variables,
- assuming that innervation profile and morphology are the determining elements of plasticity.

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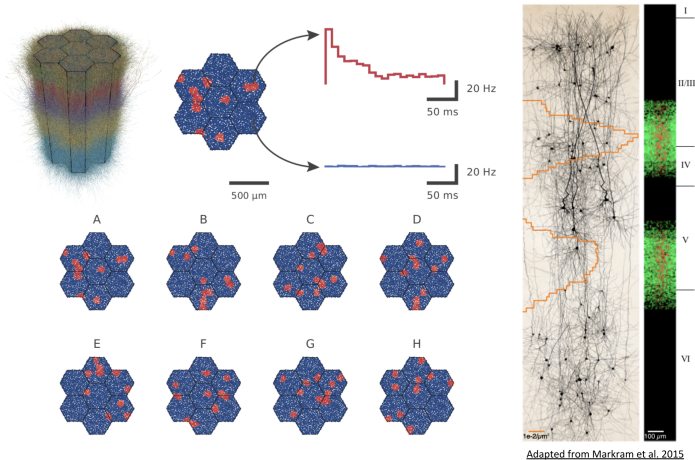
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Experiment: record and analyze variations in synaptic weights over roughly 22 minutes of simulated biological time during

- spontaneous activity, and
- stimulated activity.

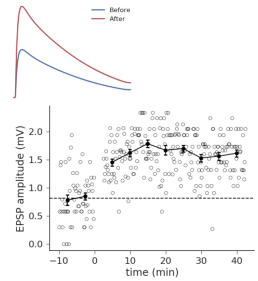
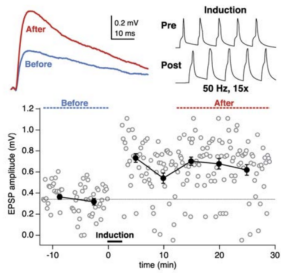
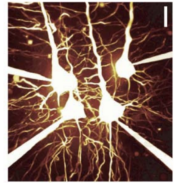
THE INCITE STIMULUS PROTOCOL



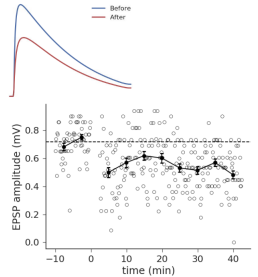
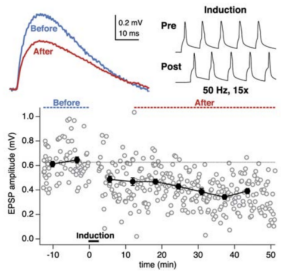
All stimuli have identical statistical properties and are presented in a random order every 200 ms.

VALIDATION

A L5 to L5



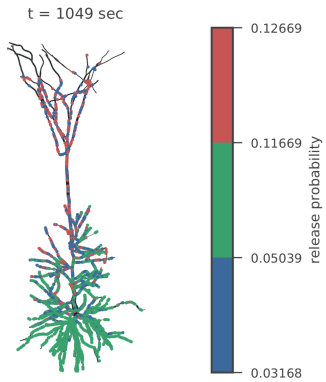
B L2/3 to L5



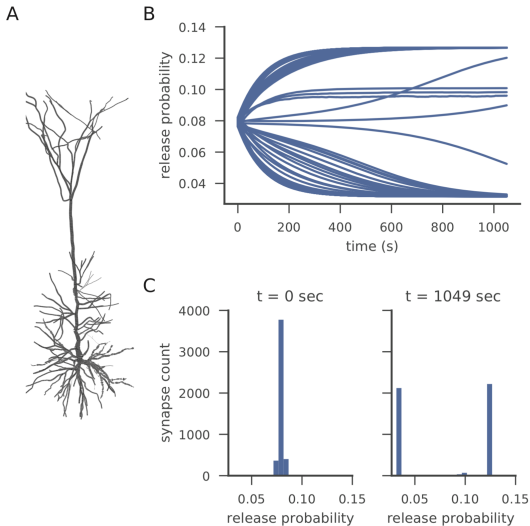
Sjostrom and Hausser 2006

In silico 2017

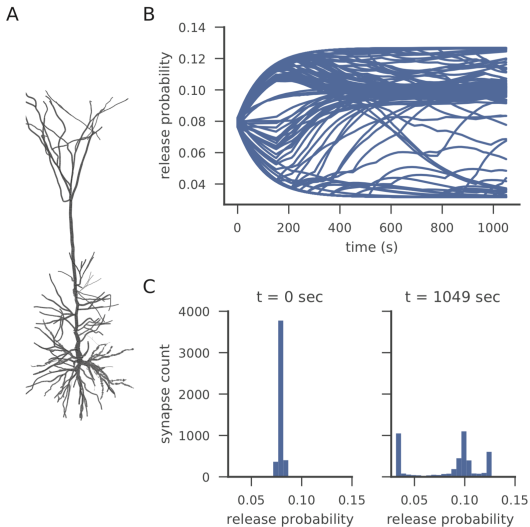
SYNAPSE WEIGHT AS A FUNCTION OF POSITION



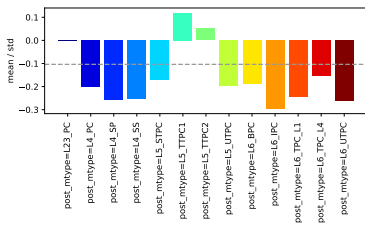
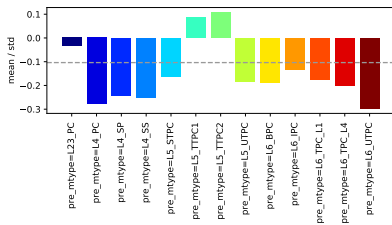
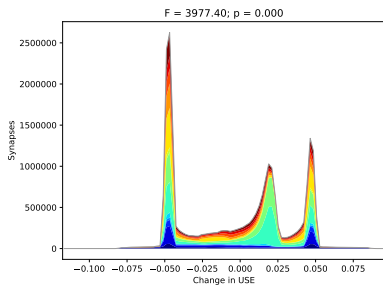
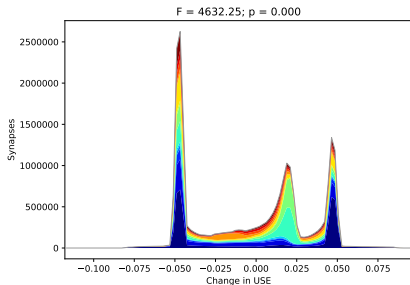
RESPONSE TO SPONTANEOUS ACTIVITY



RESPONSE TO STIMULATED ACTIVITY



CHANGE IN WEIGHT, BY PATHWAY



A FEW QUESTIONS

From detailed to general...

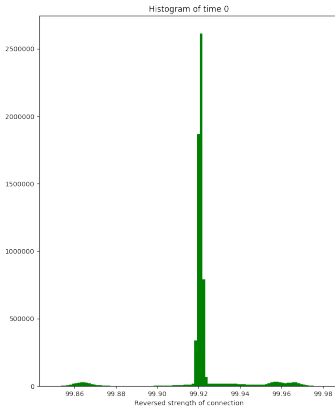
- Is the space of synaptic weights quantal?
- How to define an appropriate weight for a connection between two neurons in terms of the weights of the synapses?
- How to quantify the effect of plasticity on the network?
- What is the role of plasticity in learning and memory?

The image features a complex, dense network of thin, branching lines against a solid black background. The lines are colored in two distinct shades: a vibrant red and a deep blue. These lines are interconnected, forming a web-like structure that fills most of the frame. The red lines are more prominent and form a central, dense core, while the blue lines are more peripheral and form a secondary network. The overall appearance is that of a highly complex, interconnected graph or network structure, likely representing a topological analysis of a system.

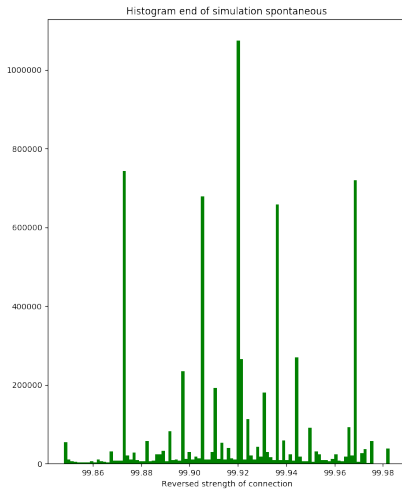
Preliminary
topological analyses

WEIGHT DISTRIBUTIONS: TIME 0

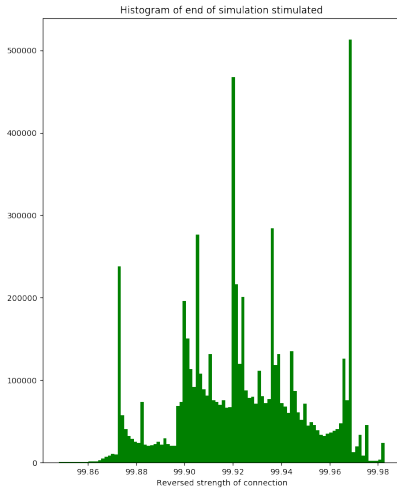
Using the **average** weight of the synapses in a connection as the weight of the connection...



WEIGHT DISTRIBUTIONS: SPONTANEOUS

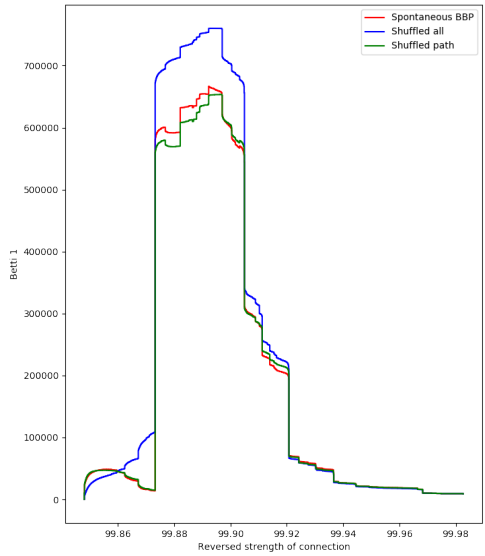


WEIGHT DISTRIBUTIONS: STIMULATED



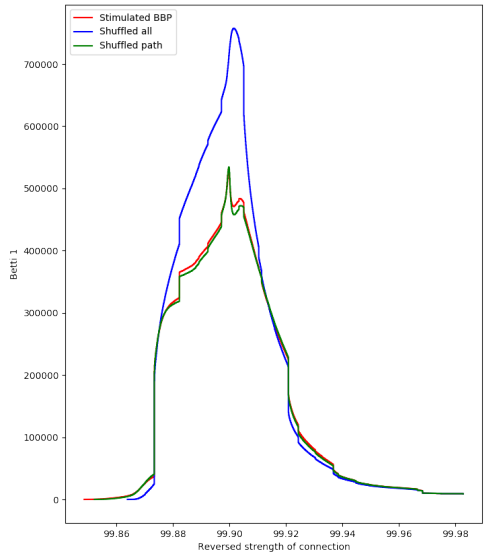
BETTI-1 CURVES: SPONTANEOUS ACTIVITY

Betti curves end of simulation sponanteous activity



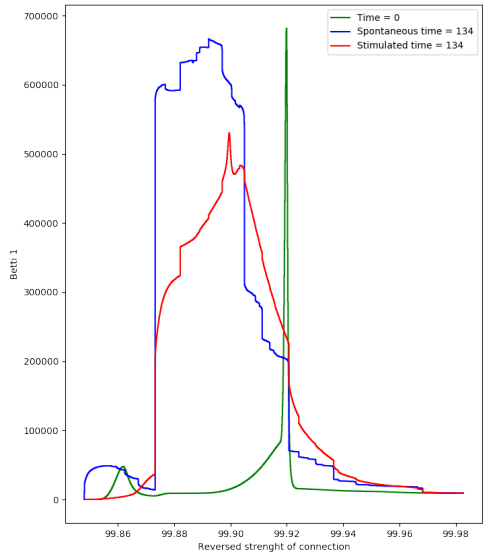
BETTI-1 CURVES: STIMULATED ACTIVITY

Betti curves end of simulation stimulated activity



BETTI-1 CURVES: STIMULATED VS SPONTANEOUS

Betti curves plasticity



EVOLUTION OF PLASTICITY: AVERAGE U

Evolution of the network: stimulation vs spontaneous activity

EVOLUTION OF PLASTICITY: AVERAGE U

Evolution of the L23PC-L23PC pathway

EVOLUTION OF PLASTICITY: AVERAGE U

Evolution of the L5TTPC1-L5TTPC1 pathway

EVOLUTION OF PLASTICITY: AVERAGE U

Evolution of the L6BPC-L6BPC pathway

EVOLUTION OF PLASTICITY: AVERAGE U

Recall: stimulation vs spontaneous activity

EVOLUTION OF PLASTICITY: SUMMING U'S

A comparison, with a different connection weight

RAN'S PERSISTENCE MOVIES


RAN'S PERSISTENCE MOVIES

WORK IN PROGRESS

- Determine what is the correct (i.e., most biologically meaningful) weighting to use on connections. Perhaps a “filtered” version of the sum of u 's?
- Perform topological analyses of activity, in terms of weighted transmission-response graphs, at different stages of the plasticity simulation.
- Determine the biological meaning (if any!) of the structure of these time series of PD. Correlation of some sort with learning?
- Carry out similar analyses for [structural plasticity](#) (elimination/creation of synapses, in addition to weight changes).

COLLABORATORS

- Stefania Ebli, Daniela Egas Santander, Nicolas Ninin, Martina Scolamiero, Gard Spreemann, and Dimitri Zaganidis (Laboratory for Topology and Neuroscience, EPFL)
- Nicolas Antille (visualization), Giuseppe Chindemi, Henry Markram, Eilif Muller, Max Nolte, and Michael Reimann (Blue Brain Project, EPFL)
- Dejan Govc, Ran Levi, and Daniel Lütgehetmann (Aberdeen)



Tusen takk!

COMING ATTRACTIONS...

Workshop on topology and neuroscience

28–30 November 2018

EPFL

Lecture series by Carina Curto and Olaf Sporns

Talks by 12 other invited speakers

Poster session