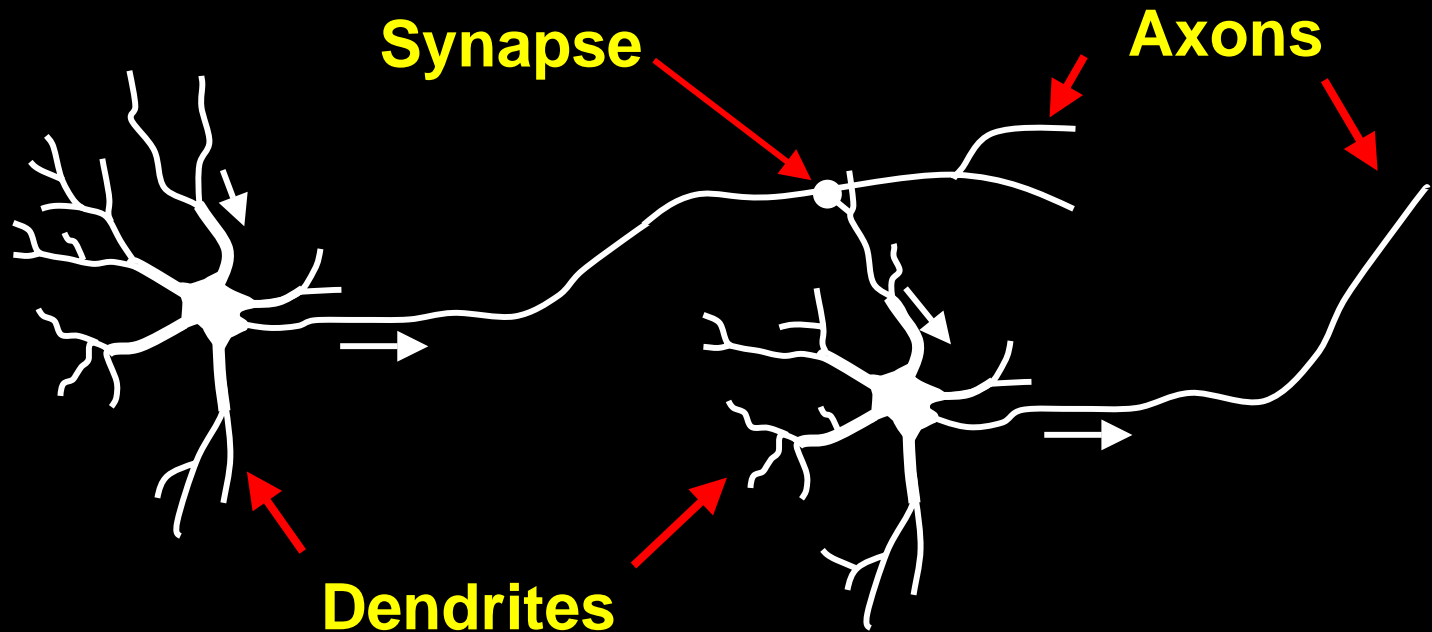


Evolution as the blind engineer: wiring minimization and logic modules in the brain

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Foundations of theoretical neurobiology

Whole $>$ Σ parts



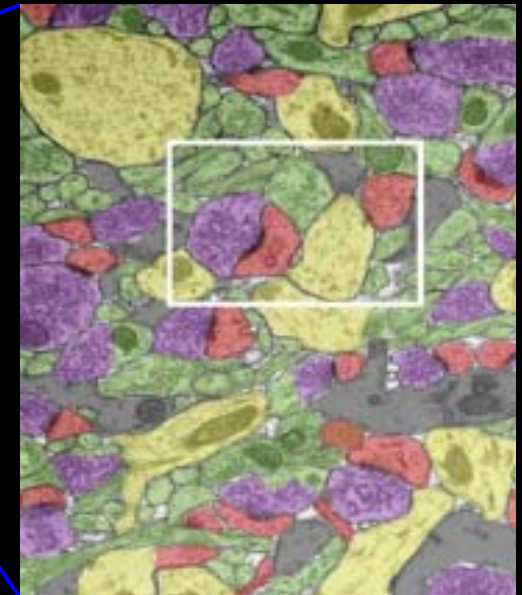
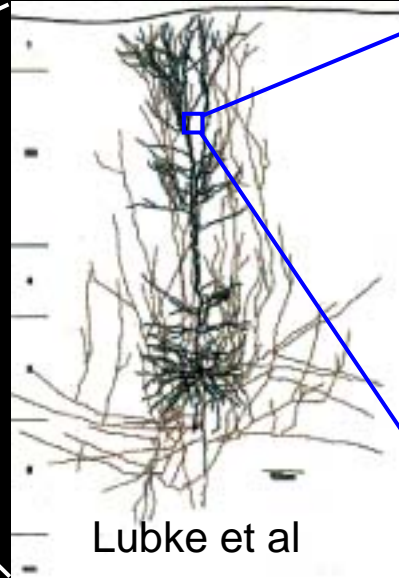
Neuron integrates incoming spikes and sends an outgoing spike when threshold is exceeded

Foundations of theoretical neurobiology II

More = different

Brain $\sim 10^{11}$ neurons

Synapse



10cm

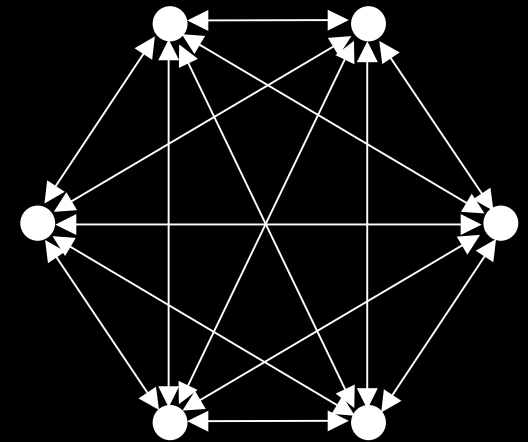
1mm

1 μ m

Cortical column: $\sim 1\text{mm}^3$ containing $\sim 10^5$ neurons

Part I: Wiring problem

- Network of N neurons
- Fully connected (all-to-all)
- Fixed wire diameter, d

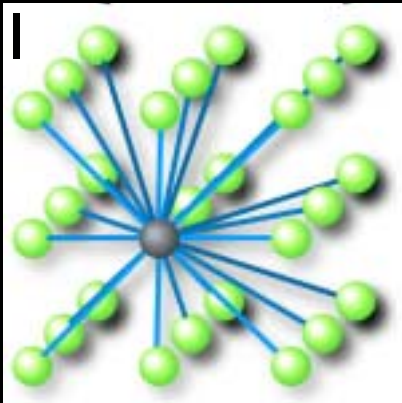


Find wiring design minimizing
network volume

Network volume for different wiring designs

Cortical column: $R=1\text{mm}$, $N=10^5$, $d=0.3\mu\text{m}$; $1\mu\text{m}$, $s=2.5\mu\text{m}$

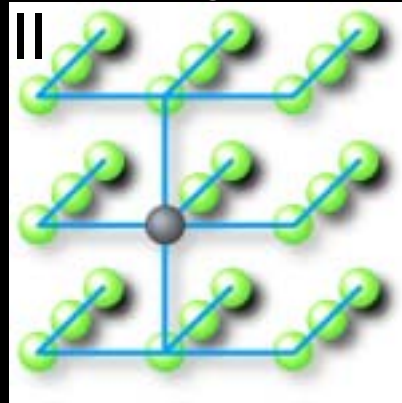
I Point-to-point axons



$$R^3 \sim N^3 d^3$$

30,000mm³

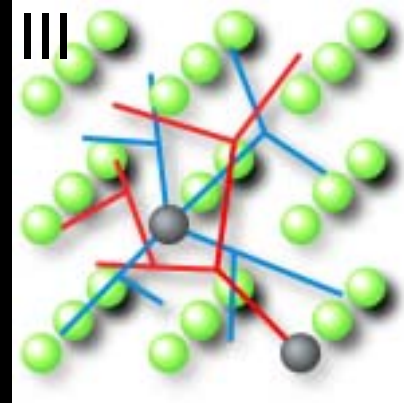
II Branching axons



$$R^3 \sim N^{5/2} d^3$$

100mm³

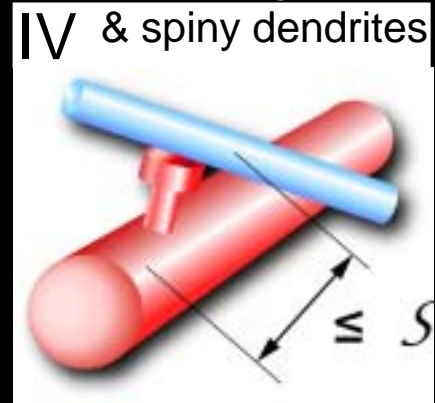
III Branching axons & dendrites



$$R^3 \sim N^2 d^3$$

2mm³

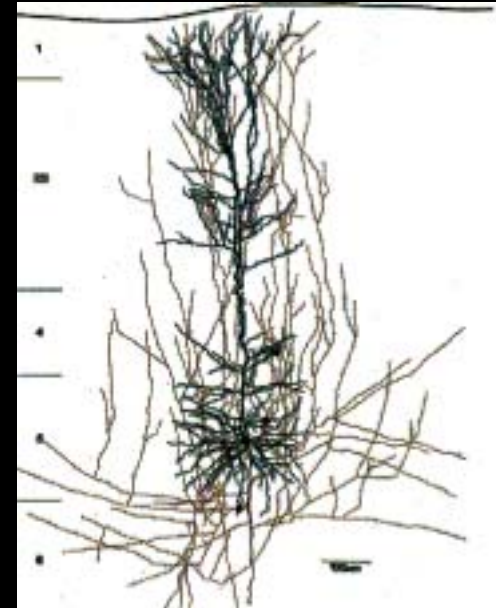
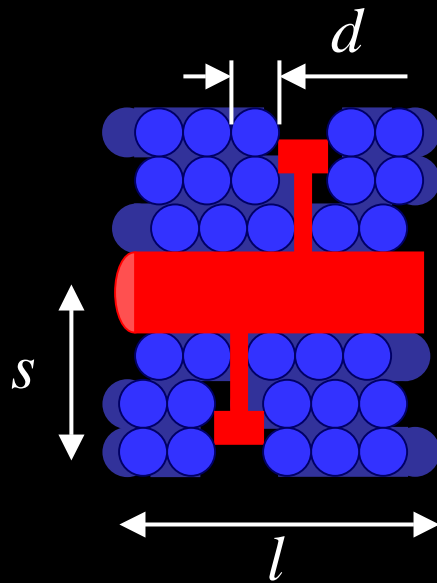
IV Branching axons



$$R^3 \sim N^2 d^4 / s$$

0.6mm³

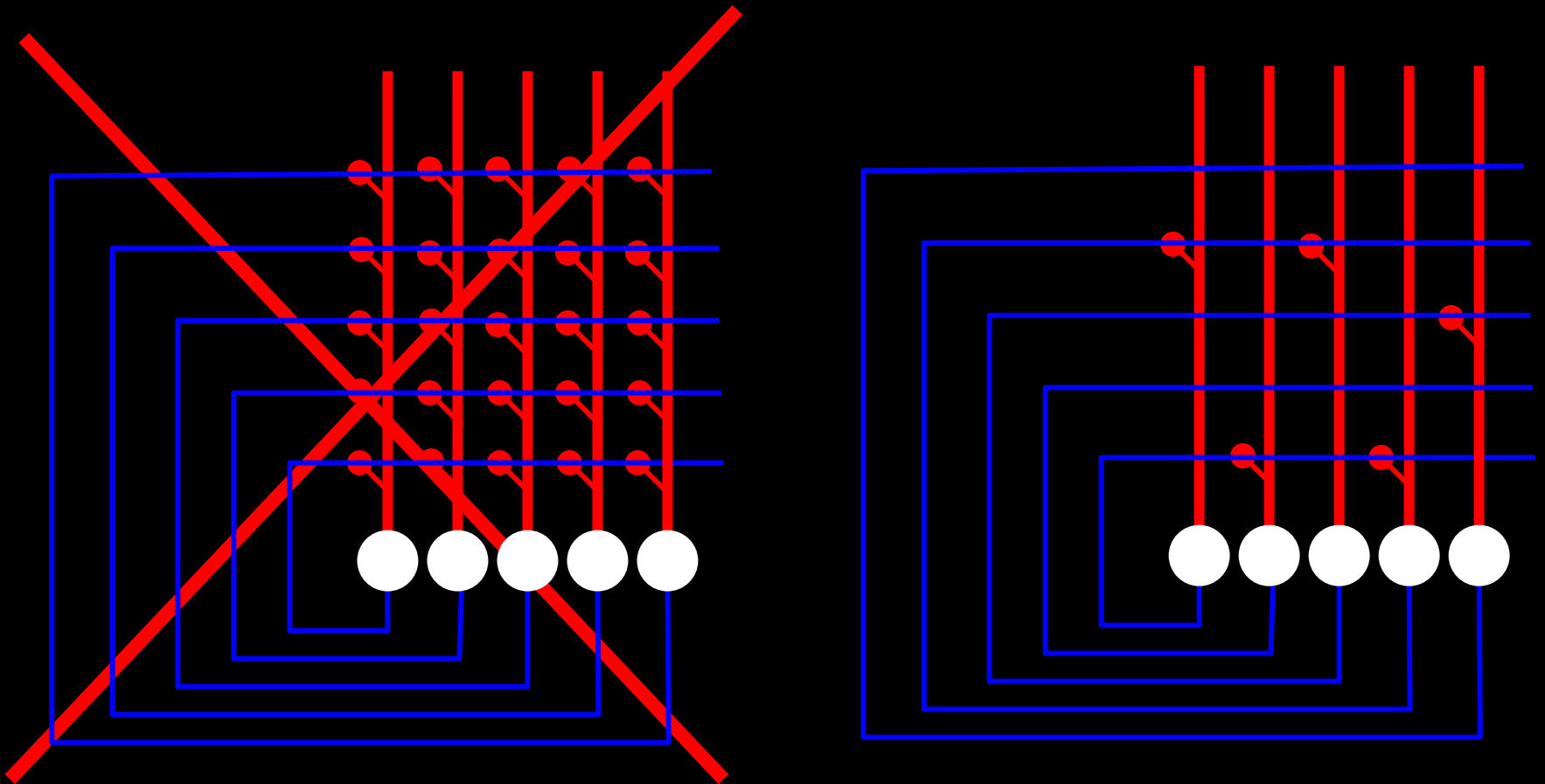
Axons and dendrites are shortest possible for given diameters and inter-connectivity



Minimal length of a dendrite with N potential synapses: $l \sim Nd^2/s$

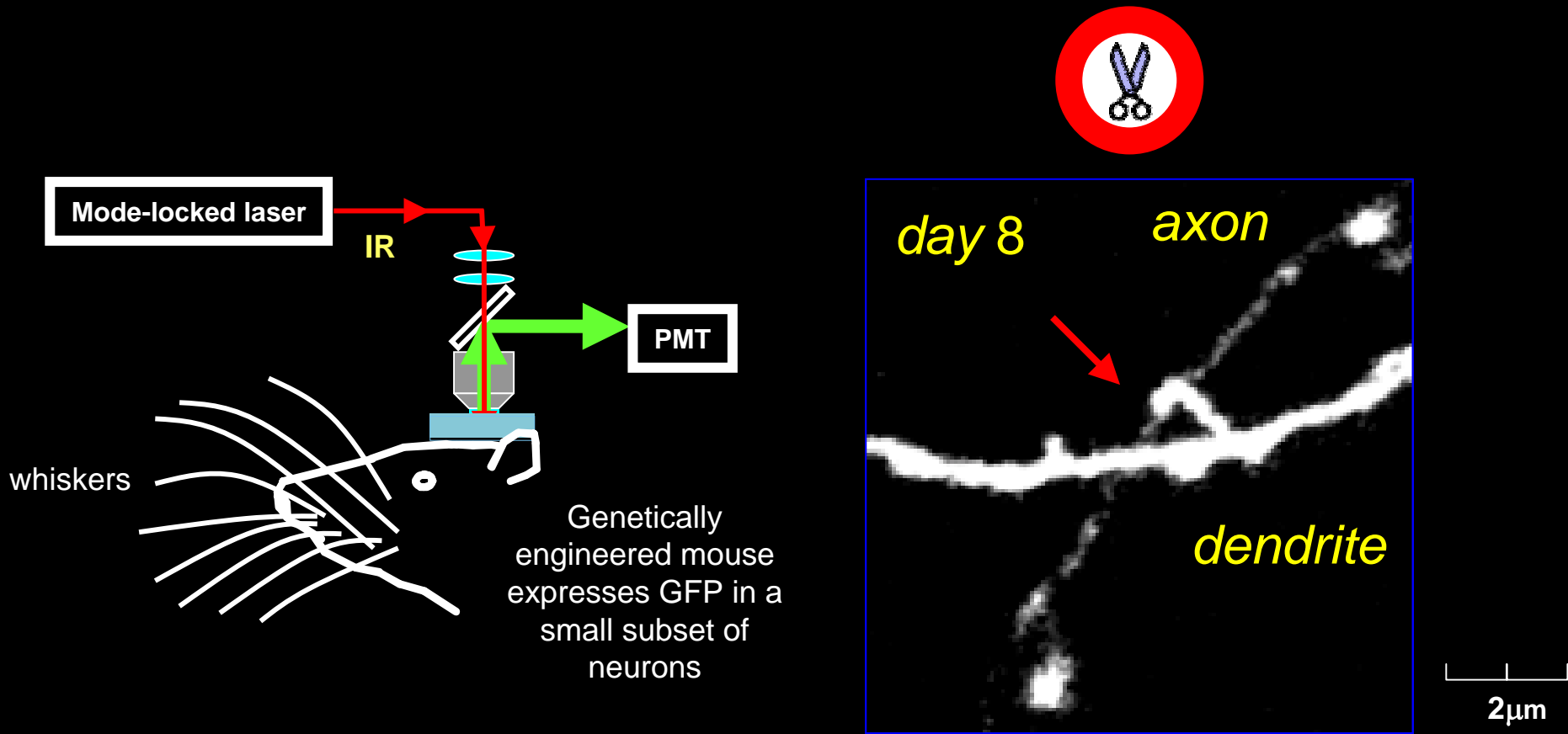
$$N=10^5 \quad d=0.3\mu\text{m} \quad s=2.5\mu\text{m} \quad \Rightarrow l=4\text{mm}$$

Cortical architecture is optimized for high inter-connectivity



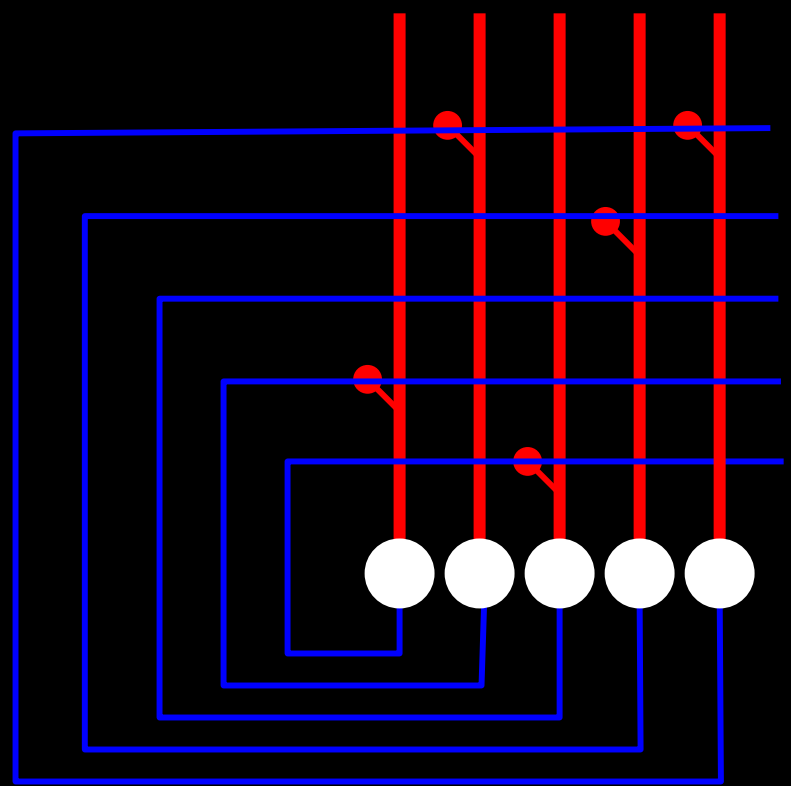
Synapse re-arrangement is potential memory mechanism with high information storage capacity (Stepanyants, Hof, Chklovskii, 2002)

Two-photon imaging provides evidence of synapse re-arrangement *in vivo*



Trachtenberg, ..., Svoboda, 2002

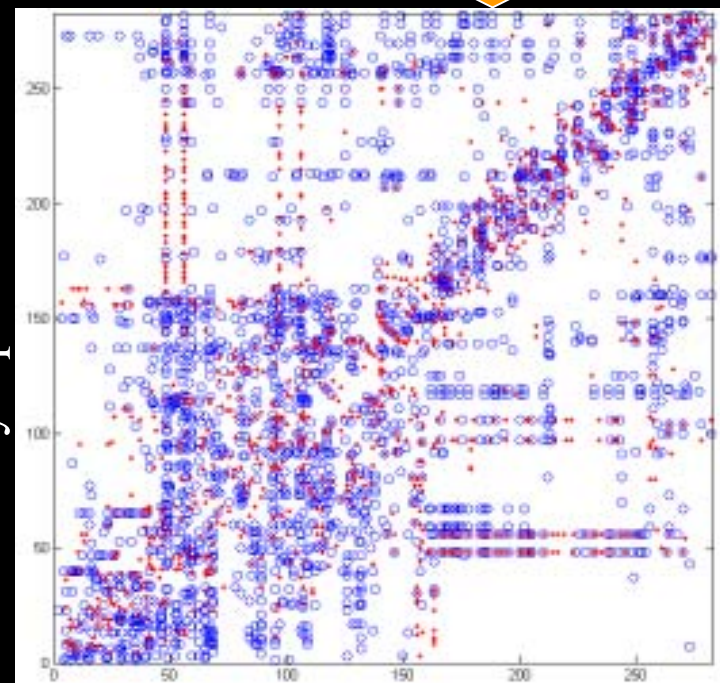
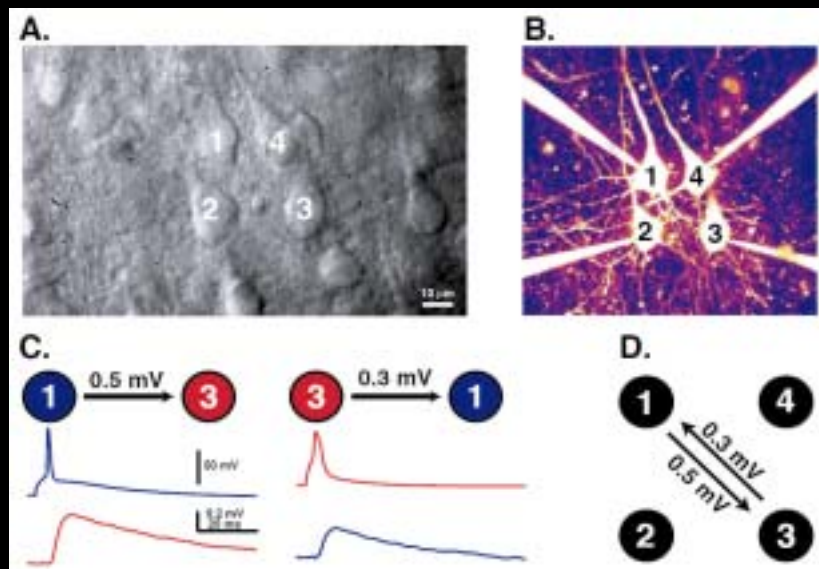
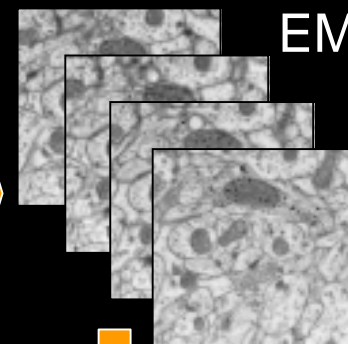
Part II: Search for logic modules



Hypothesis: Multi-neuronal modules performing stereotypical function may manifest themselves in recurring patterns of connectivity

Strategy: Discover modules by searching for over-represented multi-neuron connectivity patterns

Neuronal connectivity datasets



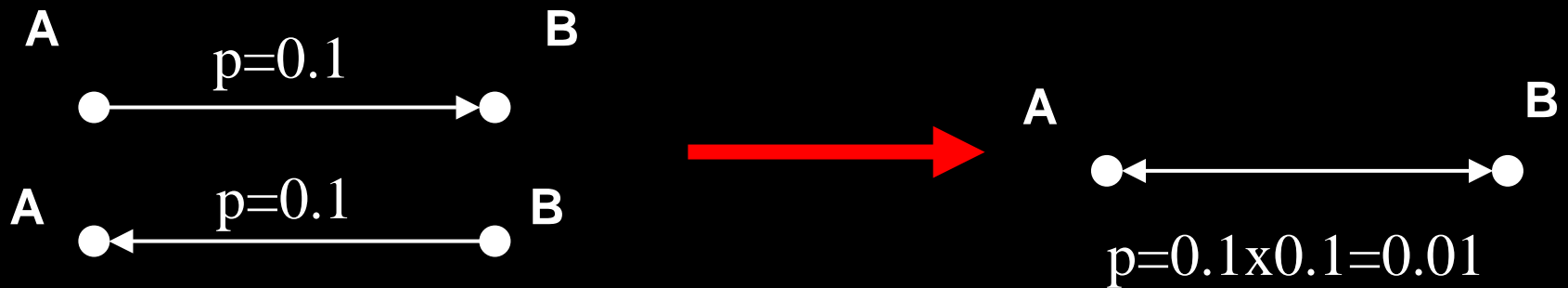
Sjöström & Nelson (Brandeis)

Post-synaptic Neuron

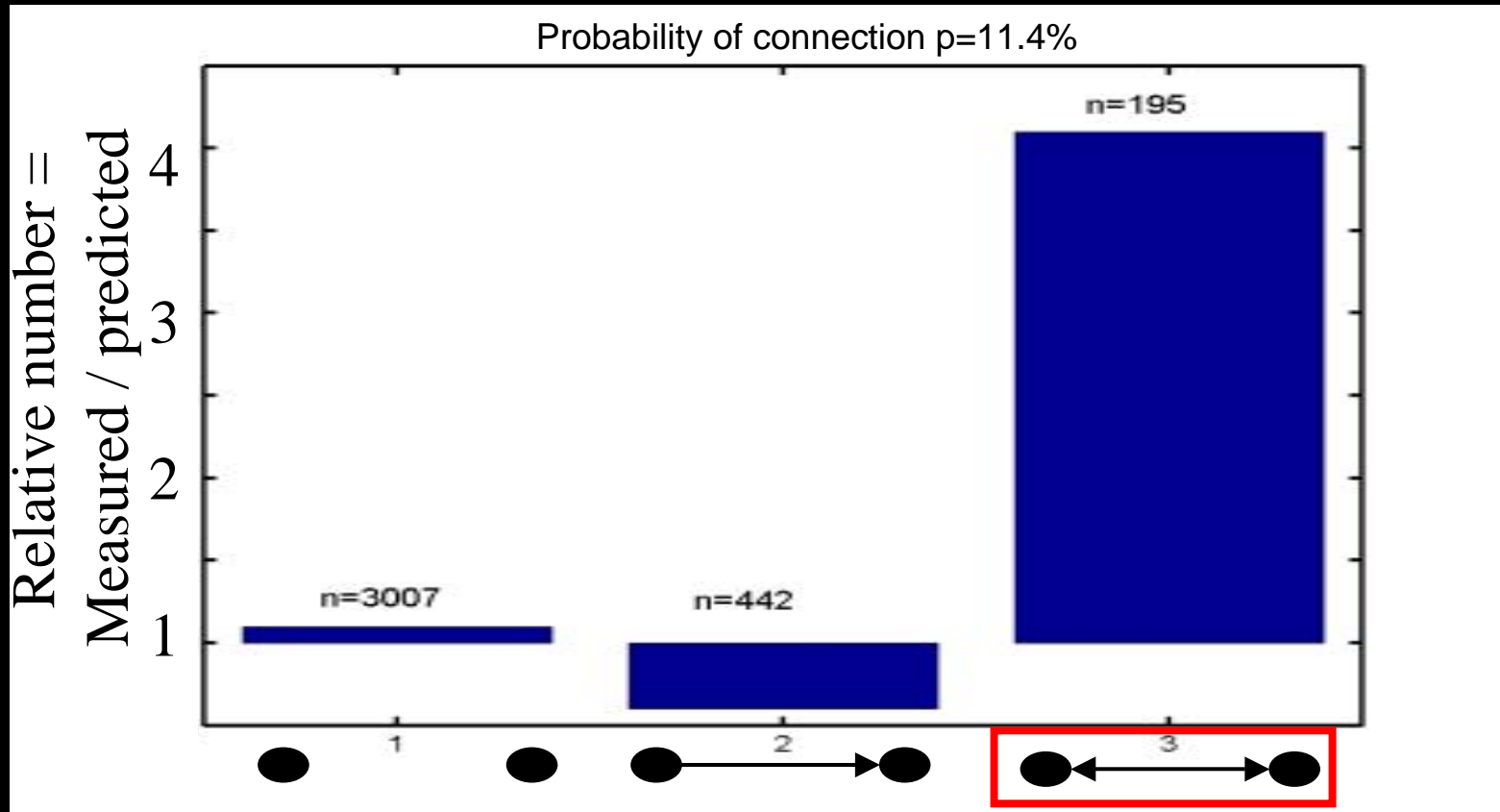
Null-hypothesis: network with Poisson connectivity statistics (Erdos-Renyi random graph)

Connection probabilities are independent

Example:

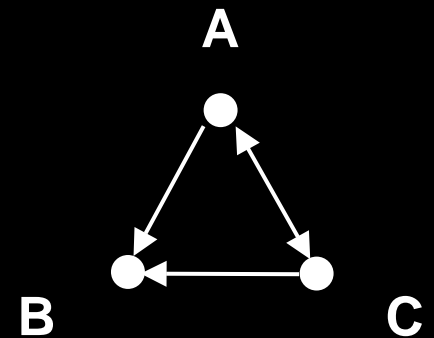
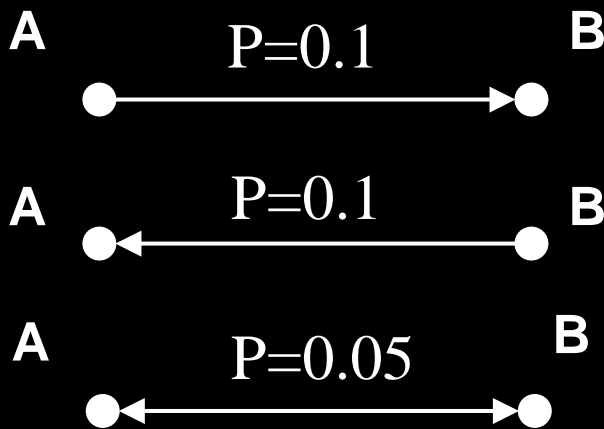


Two-neuron motifs



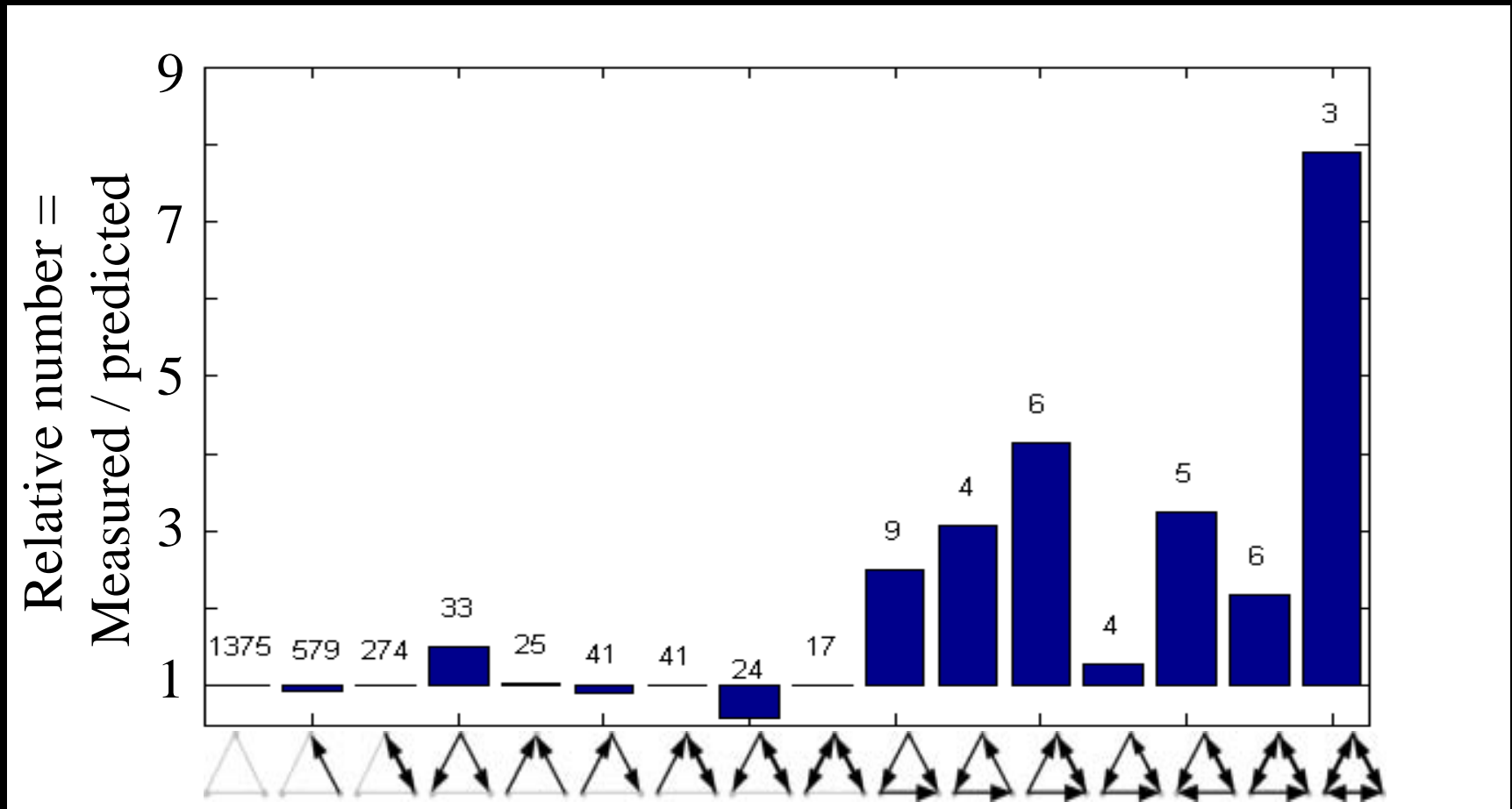
Reciprocal connections are over-represented both in rat cortex and in *C. elegans*

New null-hypothesis: network with three kinds of connections chosen independently



$$P = C_3^1 \times 0.1 \times 0.1 \times 0.05 = 0.0015$$

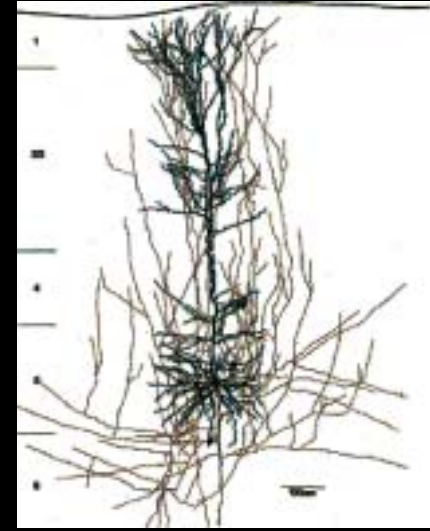
Three-neuron motifs



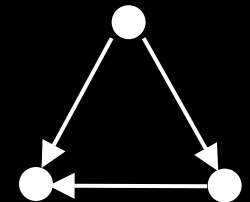
Actual numbers of triplets recorded are shown above the bars

Summary

Wiring minimization is a key factor determining brain architecture.
Many challenging problems remain



Wiring diagram contains motifs, which are candidates for logic modules.
We need more ideas to decipher the wiring diagram of the brain



Acknowledgments

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