CSE 40171: Artificial Intelligence



The Brain: Neural Computation

The brain at the circuit level





N. Kasthuri et al. Cell 2015

Neuronal Structures



Electrophysiology



Typical equipment used during classical patch clamp recording 😔 BY-SA 4.0 PeaBrainC

Two-Photon Excitation Microscopy



Typical equipment used during classical patch clamp recording 🐵 BY 2.0 Armen R Kherlopian, Ting Song, Qi Duan, Mathew A Neimark, Ming J Po, John K Gohagan and Andrew F Laine

X-Ray Tomography



Dyer et al. eNeuro 2017

Electron Microscopy



Joesch et al. eLife 2016

Connectomics

"You are your Connectome"



EM reconstruction of mouse brain cortex. Lichtman Lab, Harvard University

Ambitious Goals

- Map *all* of the connections in a brain, neuron by neuron, synapse by synapse
- Understand the elements of neural computation
 - Vision, Motor Control, Language, Learning
- Understand abstract aspects of the mind
 - Memory, Intelligence, Personality, Identity
- New therapies for mental illnesses that present without an obvious pathology
 - Autism and Schizophrenia

C. elegans Connectome

Start Small: 302 neurons



Cut 50nm cross-sections of the worm, and trace the synapses

C. elegans Connectome

12+ year manual effort (1970s - 1980s) *Computer Vision was in its infancy



Drosophila Connectome

- Approximately 100,000 Neurons
- Approximately 10,000,000 Synapses



serial section Transmission Electron Microscopy (ssTEM) data set of the Drosophila first instar larva ventral nerve cord (VNC)

Albert Cardona, Stephan Saalfeld, Stephan Preibisch, Benjamin Schmid, Anchi Cheng, Jim Pulokas, Pavel Tomancak and Volker Hartenstein (10, 2010), "<u>An Integrated Micro- and</u> <u>Macroarchitectural Analysis of the Drosophila Brain by Computer-Assisted Serial Section</u> <u>Electron Microscopy</u>", PLoS Biol (Public Library of Science) **8** (10)

Rat Connectome

- Tens of millions of neurons and billions of connections between them
- Petabytes of data for even small volumes of tissue
- Cannot do this by hand: we need computer vision



Macroconnectomes

The mammalian brain has on the order of 500 – 1,000 gray matter regions and 25,000–100,000 macroconnections between them.



Swanson and Lichtman Annu. Rev. Neurosci. 2016

Mesoconnectomes

Global mesoconnectomes are the sets of axonal connections between *specific neuron types* within and between gray matter regions of a gender, age, or disease state of a species.



Microconnectomes

Establish canonical synaptic connectivity matrix that interconnects neurons of different types



1414 Rods and Cones 😇 BY 3.0 OpenStax College

Nanoconnectomes

Nanoconnections are at the most fine-grained level, where the two nodes are pre- and postsynaptic elements of a synapse



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How do neurons perform computation?

Perceptrons are a (very) simplified model of biological neurons





Cell body or Soma

McCulloch-Pitts Model

For a given artificial neuron, assume:

m + 1 inputs with

signals x_0 through x_m

weights wo through wm

 x_0 is a bias term assigned to +1 ($w_{k0} = b_k$)

m actual inputs to the neuron $(x_1 \text{ to } x_m)$

McCulloch and Pitts. Bulletin of Mathematical Biophysics 1943



Hebbian Learning

"Let us assume that the persistence or repetition of a reverberatory activity (or "trace") tends to induce lasting cellular changes that add to its stability.[...] When an axon of cell A is near enough to excite a cell B and repeatedly or persistently takes part in firing it, some growth process or metabolic change takes place in one or both cells such that A's efficiency, as one of the cells firing B, is increased."

Artificial Neural Networks

Add gradient-based learning

