In the Name of God

Parallel Processing and Simulation in **Computational Neuroscience**

By: S. Sara Aghvami

ssa.aghvami@gmail.com

HPC workshop, NBML, May 2019

Why We Do Simulations, How We Verify the Results?

What is a Model?

Analytical

→ Gray Box Modeling

Data Driven

Where to Simulate?

- We can not measure due to complexity of the system or technical limitations.
- We can measure, but it is expensive.

Moving on the Boundaries...

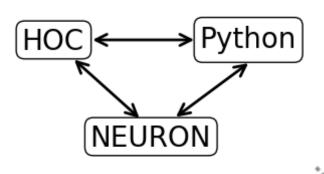
- Challenge for biologists
- Challenge for mathematicians, and theory guys!

- Simulator vs language ... A good simulator?
 - Powerful in computation
 - User friendly

Simulator vs Language Recitive

MATLAB: MAtrix LABoratory

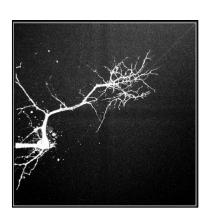
- NEURON: Compartmental Modeling---details, small networks
- Genesis: Compartmental Modeling---details
- BRAIN: Spiking Neural Networks---not for clusters
- NEST: Spiking Neural Networks---large networks
- Python
- C++



HPC in Neuroscience

- Structural connectomics data
- Massive neurophysiology datasets
- Hosting and sharing multimodal data
- Data synthesis through neural circuits simulation

```
pt3dadd(369.044, -798.133, -73.4235, 34.1019)
pt3dadd(370.175, -800.967, -73.4306, 32.2931)
pt3dadd(371.306, -803.802, -73.4378, 30.4843)
pt3dadd(372.438, -806.636, -73.445, 28.6756)
pt3dadd(373.569, -809.471, -73.4522, 26.5745)
                                                  NEURON Main Menu
pt3dadd(374.7, -812.306, -73.4593, 23.0606)
pt3dadd(375.832, -815.14, -73.4665, 19.0271)
pt3dadd(378.094, -820.809, -73.4809, 7.49816)
pt3dadd(379.226, -823.644, -73.488, 4.84356)
pt3dstyle(1, 367.296, -793.753, -73.4124)
pt3dadd(363.81, -765, -70.08, 1)
pt3dadd(356.81, -718, -70.08, 1)
 pt3dadd(374.81, -652, -70.08, 1)
pt3dadd(374.81, -652, -70.08, 1)
 pt3dadd(404.81, -634, -74.63, 1)
   3dadd(617.81, -509, -84.86, 1)
   3dadd(665.81, -498, -83.73, 1)
end[2] (pt3dclear()
pt3dadd(699.81, -491, -83.73, 1)
```



Large Scale Simulations

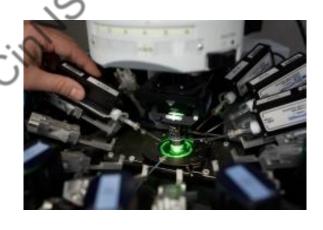
 Many heterogeneous elements, complex integration, different spatio-temporal scales

 Measuring and manipulating neuronal activity, for long period of time and for a large size...

HPCIMS

The BLUE BRAIN Project

- Founded in 2005 by H.Markram at the EPFL in Lausanne, Switzerland.
- 2023: Cellular-level simulation of the entire human brain!



- •4,096 quad-core nodes (16,384 cores in total)
- •Each core is 850 MHz
- •16 terabytes of memory
- •1 PB of disk space (1000 TB)
- Operating system: Linux SuSE SLES 10

- •Morphology, electrophysiological behavior, location, population density.
- •One second of simulated time takes five minutes to complete (300X)



NST.HP CITT Acquiring experimental data In silico reconstruction of cellular, and synaptic anatomy and physiology 1 St.HPCinN In silico predictions for Simulation revealed a spectrum of activity states the in vivo state HPCinN

NST.HPCITT.

NST.HPCINNS

HPCIMS

NEURON

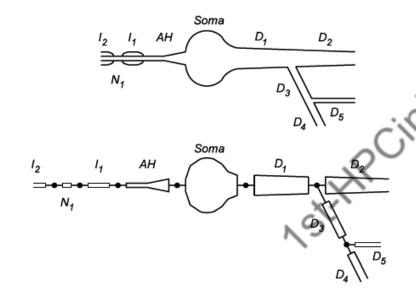
• John Wilson Moore, famous for TTX, Duke University, 1984, first concepts of "computational neuroscience", Yale University

 Michael Hines (Mathematics), Ann Stuart (Biology), Gordon Shepherd, Zach Mainen (Champalimaud Neuroscience Program), Ted Carnevale, Peter Davison (CNRS)

Up to 2008: more than 700 papers by NEURON

Building up a Model...

- Defining the morphology of the network
- Defining the "sections":
 - Geometry, biophysics
- Inserting point process
- Stimulating and Recording



- Customizing the mechanisms of the sections:
 - Channels and conductance
 - Diffusion of lons

Building up a Model

- Theoretical frame works:
 - Electrical Circuits, Cable theory
 - Solving the equation:
 - Constraints, numerical methods

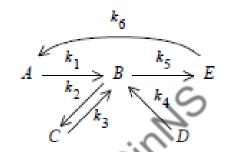
$$\frac{\partial V}{\partial T} + F(V) = \frac{\partial^2 V}{\partial X^2}$$

- Conceptual models, dynamic of conductance, Ionic pumps, exchangers...
- Flux and kinetic schemes

$$Ca_i \xrightarrow{\kappa_d} Ca_{bulk}$$
 k_d

$$Ca_i + Pump \overset{k_1}{\underset{\leftarrow}{\leftarrow}} Ca Pump \overset{k_2}{\underset{k_2}{\rightarrow}}$$

$$Ca Pump \overset{k_3}{\underset{\leftarrow}{\leftarrow}} Ca_o + Pump \overset{k_3}{\underset{k_4}{\leftarrow}}$$



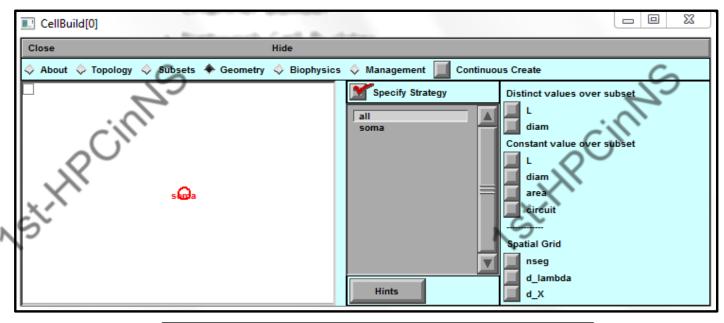
$$A + B \overset{k_f}{\underset{\leftarrow}{\rightarrow}} C$$

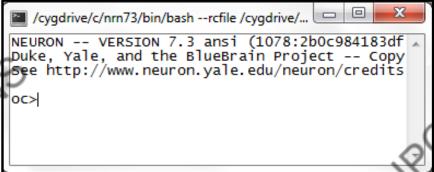
$$\frac{dA}{dt} = -k_f AB + k_b C$$

NEURON Environment

- Programing Language: hoc, an orphan language...
- Cross-Platform: Win, Linux, Mac
- GUI
 - Cell Builder
 - Channel Builder
 - Network Cell Builder
 - Simulation and Recording

- Scripting Environment
 - hoc
 - NMODL





NEURON Environment: Scripting

 hoc: Built-in interpreter, C-like syntax, added features object oriented syntax

• NMDL: Adding new mechanisms in form of physical model by nonlinear algebraic equations, differential equations or kinetic schemes

Hocmodl translator --> C --> Dynamically load shared object, executable

13

NEURON...

CT.HPCIN.				
L	section length	[µm]		
Ra	cytoplasmic resistivity	$[\Omega \text{ cm}]$		
nseg	discretization parameter	[1], i.e. dimensionless		

NST.HP CITT

NST-HPCINNS

HPCIMAS

		nseg discretization parameter [1], i.e. dimer	isionless
	5	NS	
SCIII.	Name	Meaning	Units
NST.HPO.	gna_hh	conductance density of open Hodgkin-Huxley sodium channels	[S/cm ²]
	ina	net sodium current density (i.e. produced by <i>all</i> mechanisms in a section that generate sodium current)	[mA/cm ²]
	rs	series resistance of an SEClamp	$[10^6 \Omega]$
	G max	peak conductance of an AlphaSynapse	[μS]
HPCin	i	total current delivered by an SEClamp or an AlphaSynapse	[nA]

HPC in NEURON

- ParallelNetworkManager, Since 2005
- Based on MPI
- Joint with Python

NetCon Object: Connecting Target and Source, Connecting Networks

PCINNS

ASHPC in Neuron

- Allocating Gids to the hosts
- Python interface for MPI, mpi4py

NST.HPCIN.

Simple Sample

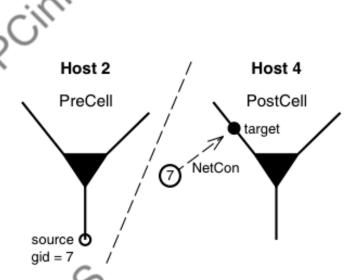


Figure 2.2. A presynaptic spike source PreCell with gid = 7 is on host 2, but its target is a synapse attached to PostCell on host 4. If PreCell spikes, a message is passed to all hosts so that NetCons that have gid 7 as their source will deliver events to their targets.

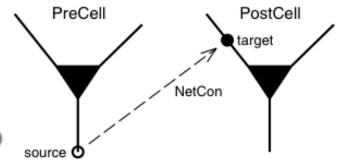


Figure 2.1. A NetCon attached to the presynaptic neuron PreCell detects spikes at the location labeled source, and delivers events to the synapse target which is attached to the postsynaptic neuron PostCell.

