

# Collaborative Development of Neural Models with NeuroML

**Sharon Crook**

School of Mathematical and Statistical Sciences & School of Life Sciences  
Arizona State University

Collaborators: R. Angus Silver, Padraig Gleeson, Robert Cannon

What is NeuroML?

Why do we need it?

How can it be used with modeling tools?

How does it support collaborative modeling?

Where is it going next?

# What is NeuroML?

---

# Towards NeuroML: Model Description Methods for Collaborative Modelling in Neuroscience

---

**Nigel H. Goddard<sup>1\*</sup>, Michael Hucka<sup>2</sup>, Fred Howell<sup>1</sup>,  
Hugo Cornelis<sup>3</sup>, Kavita Shankar<sup>2</sup> and David Beeman<sup>4</sup>**

<sup>1</sup>*Institute for Adaptive and Neural Computation, Division of Informatics, University of Edinburgh, 5 Forrest Hill, Edinburgh EH1 2QL, Scotland*

<sup>2</sup>*Division of Biology 216-76, California Institute of Technology, Pasadena, CA 91125, USA*

<sup>3</sup>*Theoretical Neurobiology, Born-Bunge Foundation, University of Antwerp, Universiteitsplein 1, 2610 Wilrijk, Belgium*

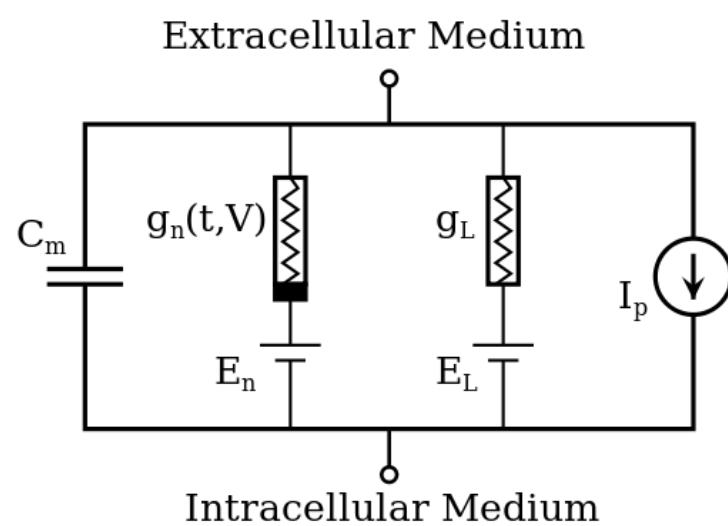
<sup>4</sup>*Department of Electrical and Computer Engineering 425 UCB, University of Colorado, 425 UCB, Boulder, CO 80309, USA*

Biological nervous systems and the mechanisms underlying their operation exhibit astonishing complexity. Computational models of these systems have been correspondingly complex. As these models become ever more sophisticated, they become increasingly difficult to define, comprehend, manage and communicate. Consequently, for scientific understanding of biological nervous systems to progress, it is crucial for modellers to have software tools that support discussion, development and exchange of computational models. We describe methodologies that focus on these tasks, improving the ability of neuroscientists to

# Why do we need it?

$$I_{ion} = \bar{g}_{Na} m^3 h (V_m - E_{Na}) + \bar{g}_K n^4 (V_m - E_K) + \bar{g}_L (V_m - E_L),$$

$$\frac{dm}{dt} = \alpha_m(V) (1 - m) - \beta_m(V) m,$$

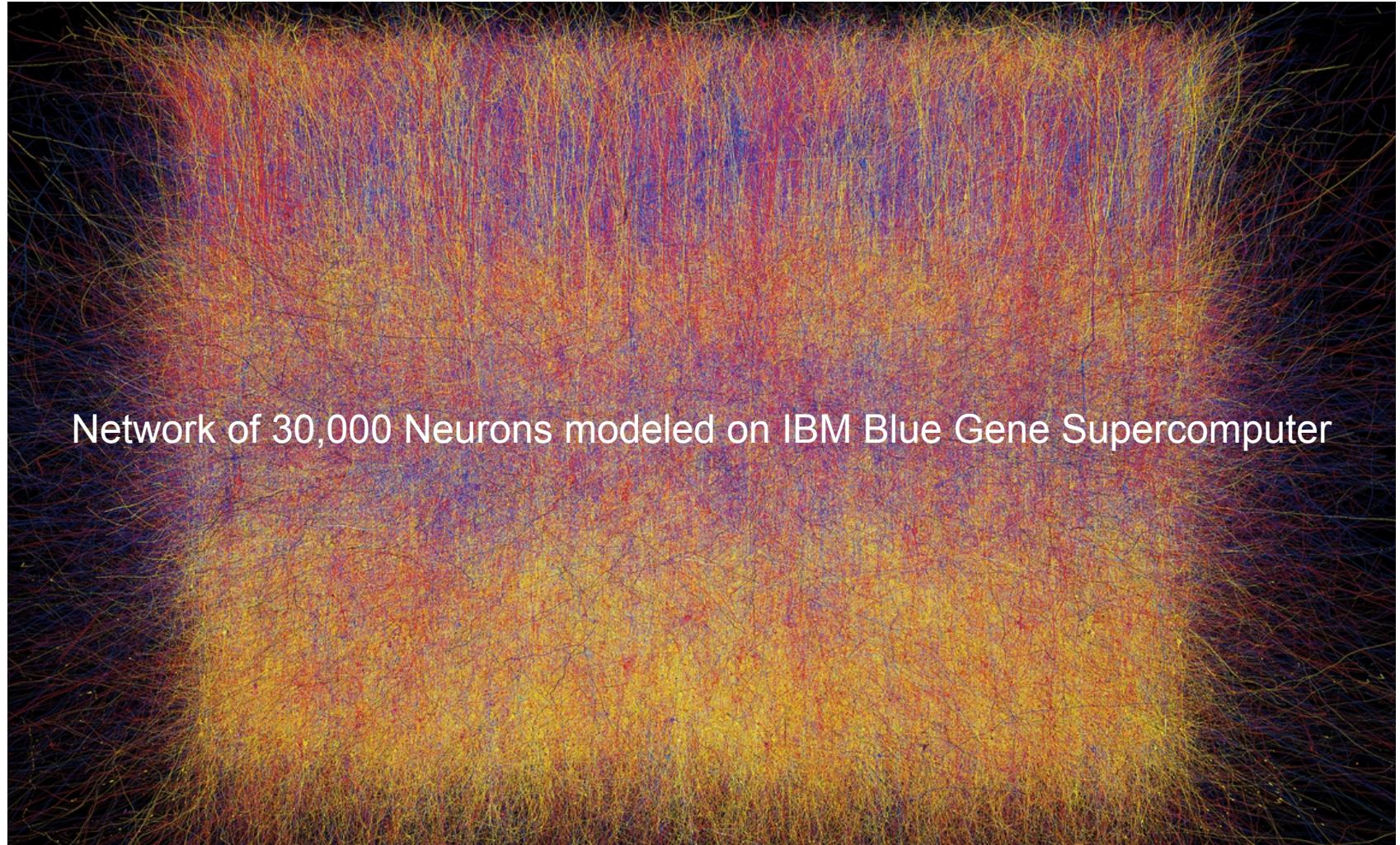


$$\frac{dh}{dt} = \alpha_h(V) (1 - h) - \beta_h(V) h,$$

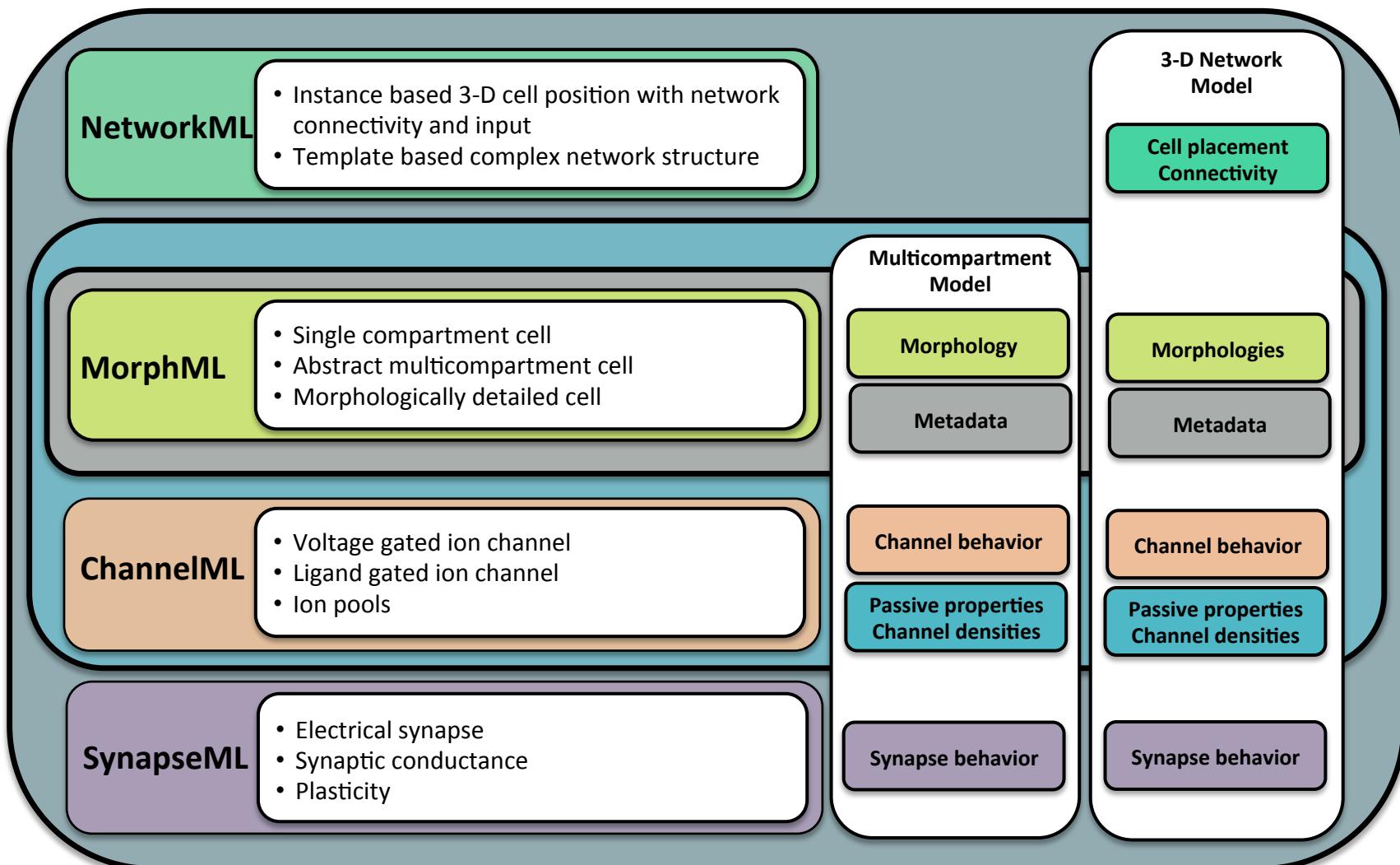
$$\frac{dn}{dt} = \alpha_n(V) (1 - n) - \beta_n(V) n.$$

Hodgkin & Huxley 1952, *Journal of Physiology*.

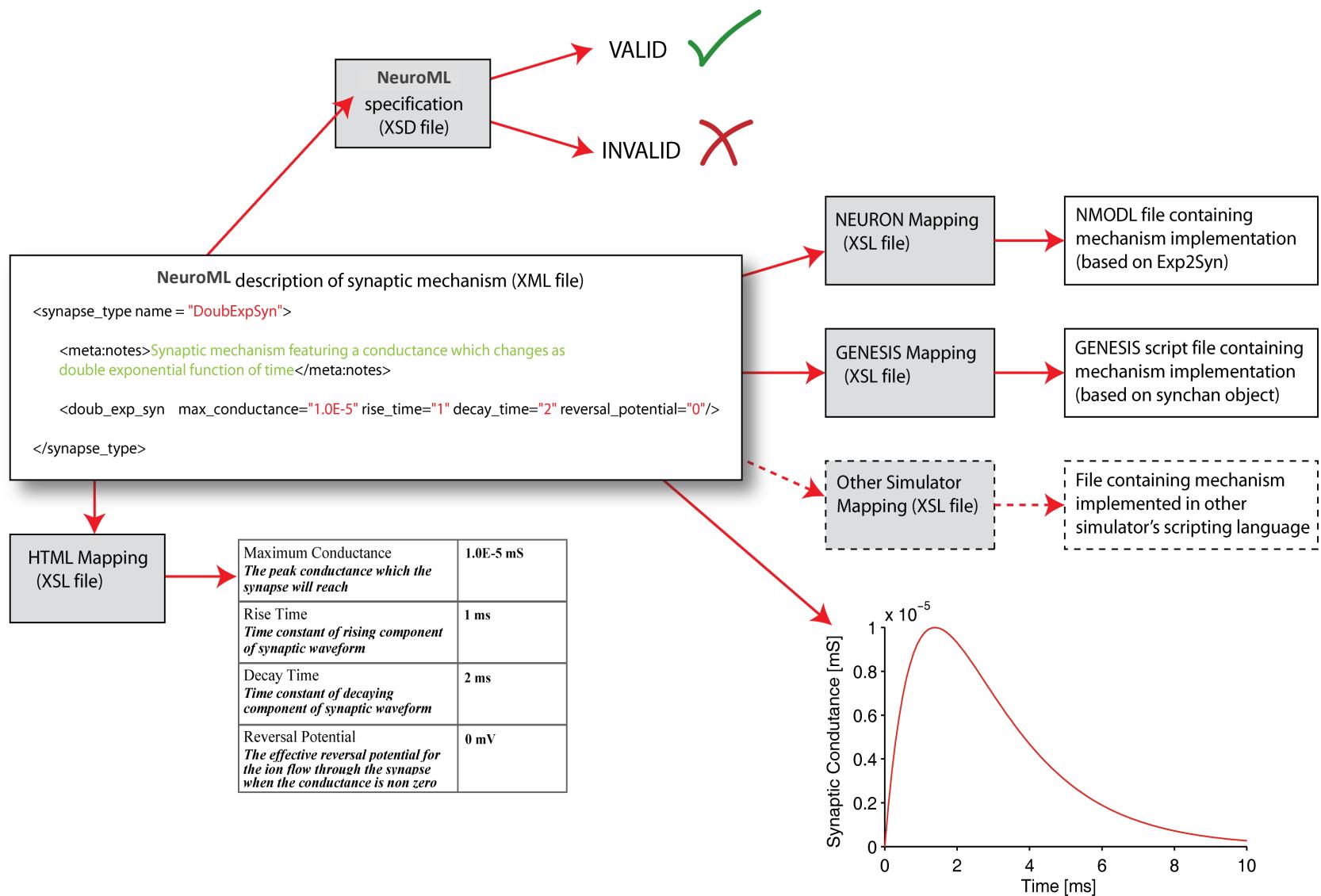
# Blue Brain Project Model of Rat Cortex



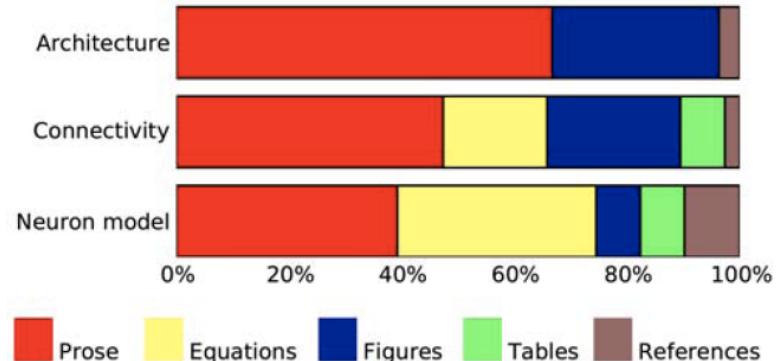
Markram et al. 2015, *Cell*.



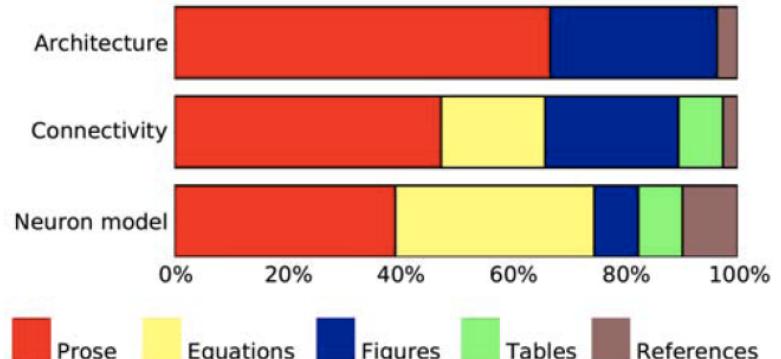
# How can it be used with modeling tools?



Nordlie et al.(2009) *PLoS Computational Biology*: Towards reproducible descriptions of neuronal network models



Nordlie et al.(2009) *PLoS Computational Biology*: Towards reproducible descriptions of neuronal network models



A Model Summary			
<b>Populations</b>		Three: excitatory, inhibitory, external input	
<b>Topology</b>		—	
<b>Connectivity</b>		Random convergent connections	
<b>Neuron model</b>		Leaky integrate-and-fire, fixed voltage threshold, fixed absolute refractory time (voltage clamp)	
<b>Channel models</b>		—	
<b>Synapse model</b>		$\delta$ -current inputs (discontinuous voltage jumps)	
<b>Plasticity</b>		—	
<b>Input</b>		Independent fixed-rate Poisson spike trains to all neurons	
<b>Measurements</b>		Spike activity	

B Populations		
Name	Elements	Size
E	Iaf neuron	$N_E = 4N_I$
I	Iaf neuron	$N_I$
$E_{\text{ext}}$	Poisson generator	$C_E(N_E + N_I)$

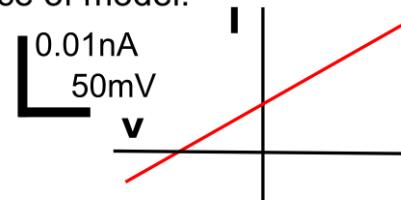
C Connectivity			
Name	Source	Target	Pattern
EE	E	E	Random convergent $C_E \rightarrow 1$ , weight $J$ , delay $D$
IE	E	I	Random convergent $C_E \rightarrow 1$ , weight $J$ , delay $D$
EI	I	E	Random convergent $C_I \rightarrow 1$ , weight $-gJ$ , delay $D$
II	I	I	Random convergent $C_I \rightarrow 1$ , weight $-gJ$ , delay $D$
Ext	$E_{\text{ext}}$	$E \cup I$	Non-overlapping $C_E \rightarrow 1$ , weight $J$ , delay $D$

# NeuroML v2 is built on LEMS

General model:  $I = g * (v - E)$   
 $I$  current through ion channel  
 $g$  conductance of channel  
 $v$  potential across channel  
 $E$  reversal potential

Specific instance of model:

$$\begin{aligned}g &= 10 \text{ pS} \\E &= -60 \text{ mV}\end{aligned}$$



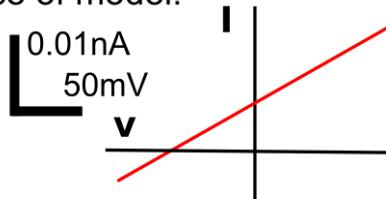
Cannon et al. 2014, LEMS: A language for expressing complex biological models in concise and hierarchical form and its use in underpinning NeuroML 2. *Frontiers in Neuroinformatics*.

# NeuroML v2 is built on LEMS

General model:  $I = g * (v - E)$   
I current through ion channel  
g conductance of channel  
v potential across channel  
E reversal potential

Specific instance of model:

$g = 10 \text{ pS}$   
 $E = -60 \text{ mV}$



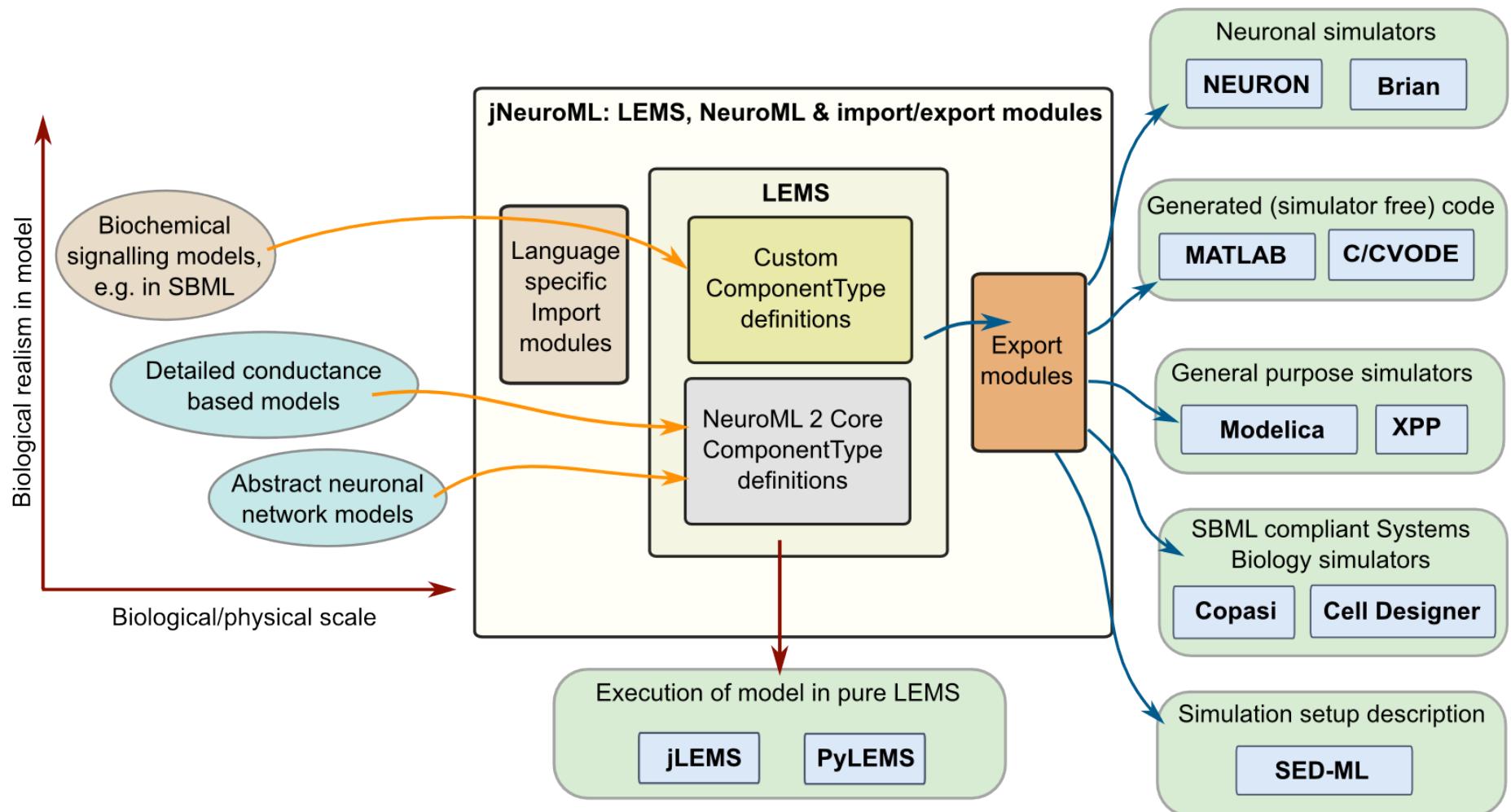
LEMS

```
<ComponentType name="passiveChannel">  
  
    <Parameter name="g" dimension="conductance"/>  
    <Parameter name="E" dimension="voltage"/>  
    <Exposure name="I" dimension="current"/>  
    <Requirement name="v" dimension="voltage"/>  
  
    <Dynamics>  
        <DerivedVariable name="I" dimension="current" exposure="I"  
                      value="g * (E-v)"/>  
    </Dynamics>  
  
</ComponentType>
```

NeuroML

```
<passiveChannel g="10 pS" E="-60 mV"/>
```

Cannon et al. 2014, LEMS: A language for expressing complex biological models in concise and hierarchical form and its use in underpinning NeuroML 2. *Frontiers in Neuroinformatics*.



## Specifications & examples

	XML SCHEMA	DOCUMENTATION	EXAMPLES	PUBLICATION
LEMS	<a href="#">LEMS_v0.7.1.xsd</a>	<a href="#">LEMS element definitions</a>	<a href="#">LEMS examples</a>	<a href="#">Cannon et al. 2014</a>
NeuroML v2beta3	<a href="#">NeuroML_v2beta3.xsd</a>	<a href="#">NeuroML 2 Core ComponentTypes (Source)</a>	<a href="#">NeuroML 2 examples (OSB models)</a>	<a href="#">Cannon et al. 2014</a>
NeuroML v1.8.1	<a href="#">NeuroML v1.8.1 Schemas</a>	<a href="#">Specifications</a>	<a href="#">NeuroML v1.x examples (OSB models)</a>	<a href="#">Gleeson et al. 2010</a>

## Implementations & APIs in Java and Python

	JAVA	PYTHON
Read, validate & execute LEMS XML files	<a href="#">jLEMS</a>	<a href="#">PyLEMS (Vella et al. 2014)</a>
Read & write NeuroML 2 files	<a href="#">Java API for NeuroML 2</a>	<a href="#">libNeuroML (Vella et al. 2014)</a>
Everything...	<a href="#">jNeuroML Parse &amp; execute LEMS; validate NeuroML v1/v2; convert LEMS to graphical format, NEURON, Brian, etc.; convert SBML to LEMS...</a>	



NeuroML Validator



neuroConstruct



Neuron



GENESIS



MOOSE



PSICS



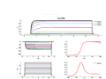
PyNN



Whole Brain Catalog



NeuronLand



Channelpedia



PCSim



CX3D



Neuromantic



neurospaces/GENESIS 3



NeuroML Java API



SplitNeuron



NeurAnim



CNrun



Trees Toolbox



TrakEM2



NeuroMorpho.org



Neuronvisio



LEMS Interpreter



NETMORPH



NeuronStudio



Neuroptikon



NeuroRD



OpenWorm

How does it support  
collaborative modeling?

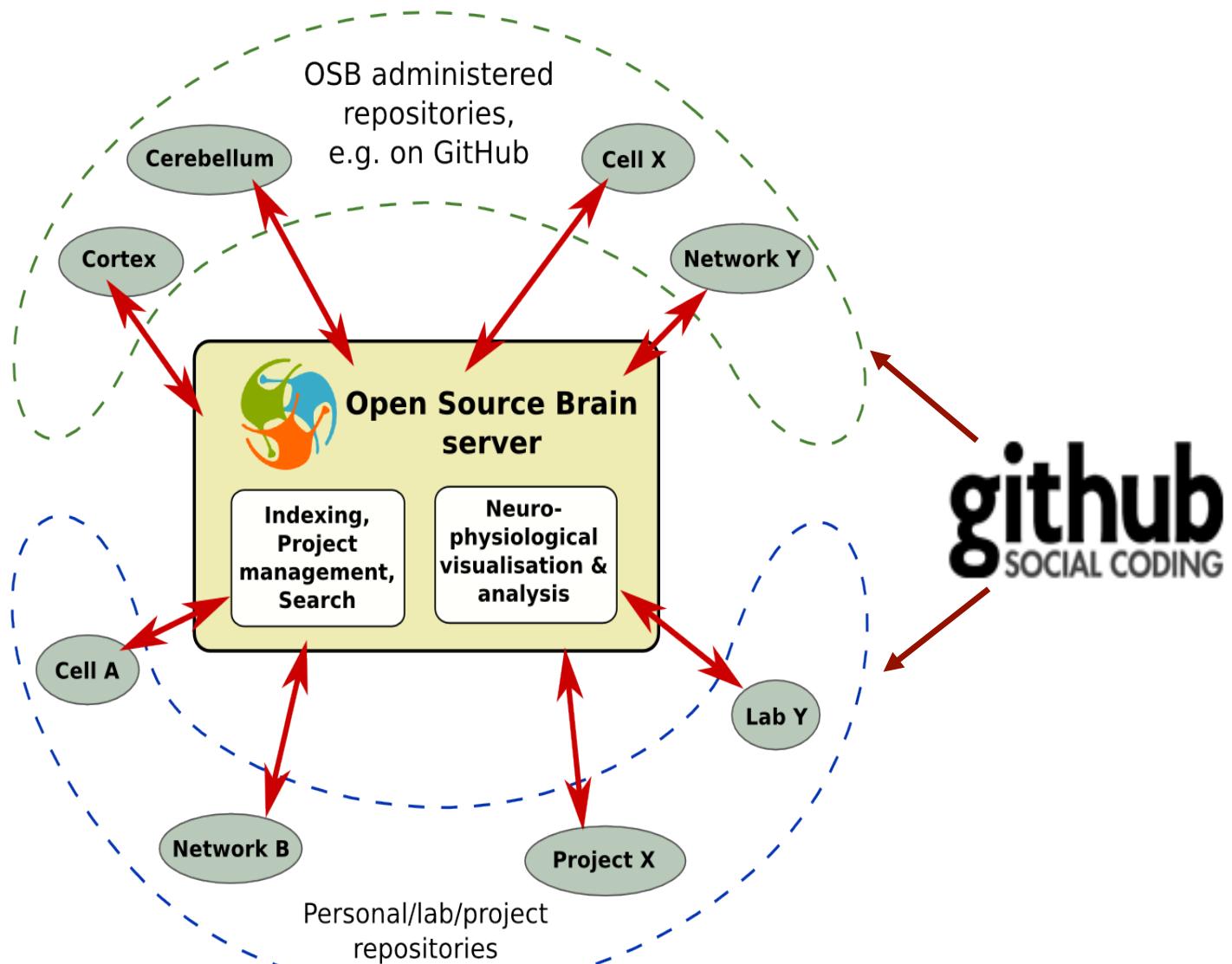
# Modelling the brain, together

**Open Source Brain** is a resource for sharing and collaboratively developing computational models of neural systems.

[Explore OSB](#)[Sign up](#)

Join us at the [Open Source Brain kickoff meeting](#) in Alghero, Sardinia in May 2013!

[About](#) [Guides](#) [Research](#) [Themes](#)Open Source Brain © 2013. All rights reserved. Website powered by [Redmine](#)Supported by  
**wellcome**trust



# Granule Cell Layer Maex and De Schutter 1998

OSB endorsed project 

Curation against published models: Good ★★★

Vertebrate / Mammalian / Rodent / Cerebellum / Network model / Granule Cell Layer - Maex and De Schutter 1998

OSB

Overview

🕒 OSB 3D Explorer ▾

Activity

Issues

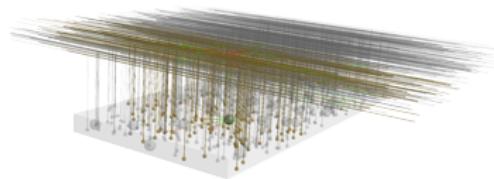
Files

Repository

Model components

- Description >
- Status >
- Members >
- References >

## Description



An extension in 3D of the Granule Cell Layer model from: Maex, R and De Schutter, E. Synchronization of Golgi and Granule Cell Firing in a Detailed Network Model of the Cerebellar Granule Cell Layer J Neurophysiol, Nov 1998; 80: 2521 - 2537.

[More...](#)

## Status

Stable implementation on NEURON and GENESIS

NeuroML v2.x support ★

NeuroML v1.x support ★★★

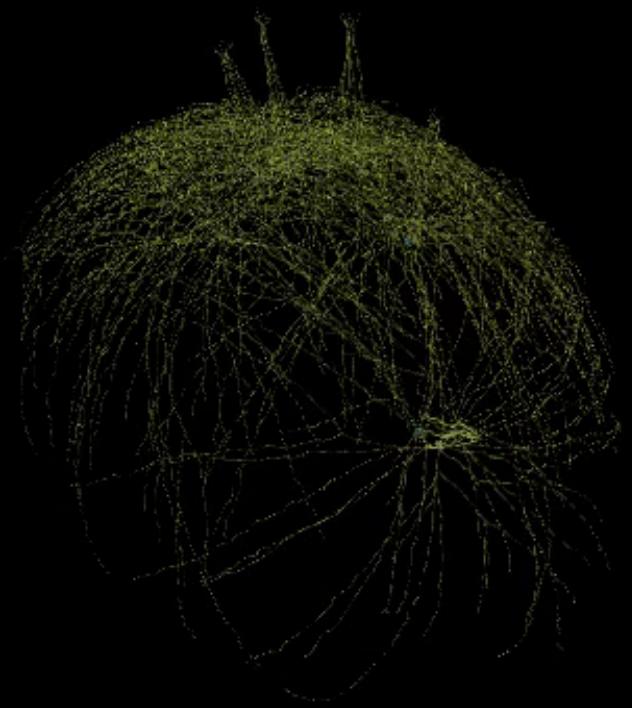
PyNN support ⓘ

NEURON support ★★★

GENESIS 2 support ★★★

MOOSE support ★

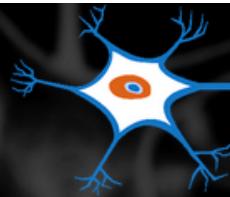
Brian support ⓘ



Model - ManyCells30

Summary

- Cell Mitral\_0\_0
- Cell Mitral\_0\_1
- Cell Mitral\_0\_2
- Cell Mitral\_0\_3
- Cell Mitral\_0\_4
- Cell Mitral\_0\_5
- Cell Mitral\_0\_6
- Cell Mitral\_0\_7
- Cell Mitral\_0\_8
- Cell Mitral\_0\_9
- Cell Mitral\_0\_10
- Cell Mitral\_0\_11
- Cell Mitral\_0\_12
- Cell Mitral\_0\_13

[Search NeuroML Models](#)[Submit NeuroML Models](#)[About NeuroML-DB](#)[NeuroML Home](#)

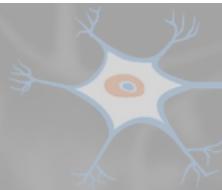
## Search NeuroML Models

### Keyword Search Results

[Purkinje Cell](#) (NMLCL000005)[CaP Channel](#) (NMLCH000037)[Calcium Pool Channel](#) (NMLCH000036)[CaT Channel](#) (NMLCH000035)[K2 Channel](#) (NMLCH000034)[KA Channel](#) (NMLCH000033)[Kc Channel](#) (NMLCH000032)[Kdr Channel](#) (NMLCH000031)[Kh1 Channel](#) (NMLCH000030)[Kh2 Channel](#) (NMLCH000029)[KM Channel](#) (NMLCH000028)[Leak Channel](#) (NMLCH000027)[NaF Channel](#) (NMLCH000026)

### Ontology Based Recommendations

[Granule Cell](#) (NMLCL000002)Located in **Granular layer of cerebellar cortex**[Golgi Cell](#) (NMLCL000004)Located in **Granular layer of cerebellar cortex**[Golgi Cell Network - Vervaeke](#) (NMLNT000070)Located in **Granular layer of cerebellar cortex**[Purkinje Cell](#) (NMLCL000005)Located in **Cerebellum**



S

## Model Information



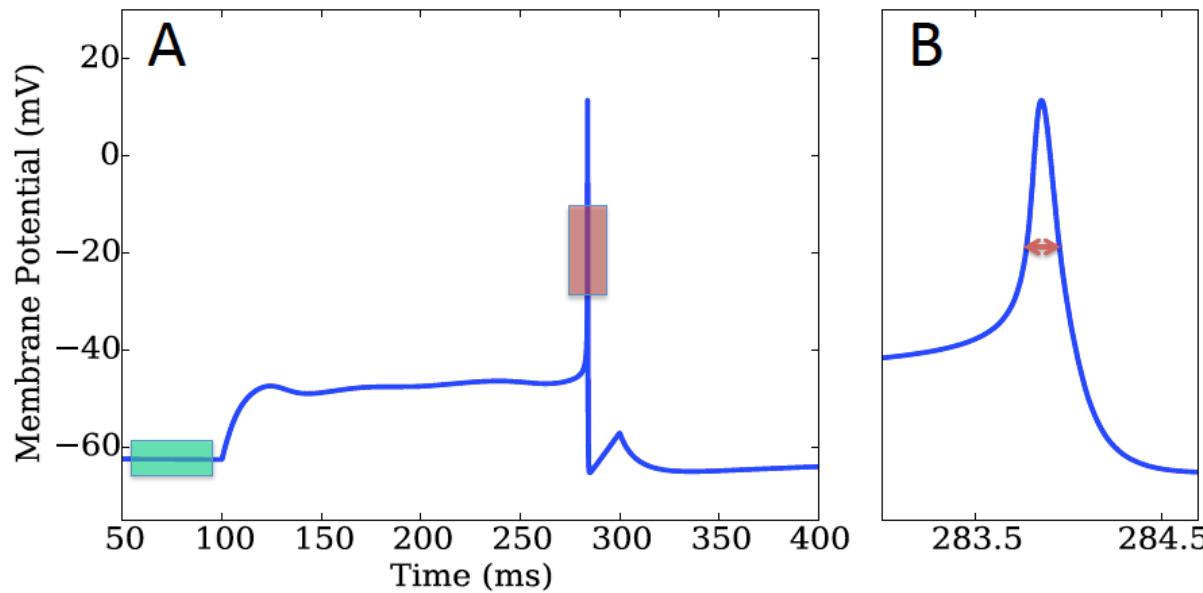
<b>Model Id:</b>	NMLCL000002	( Obtained from Open Source Brain ) 
<b>Model Type:</b>	Cell	
<b>Model Name:</b>	Granule Cell	
<b>Authors:</b>	Reinoud Maex Erik De Schutter	
<b>Translators:</b>	Padraig Gleeson	
<b>Publication:</b>	<a href="#">Synchronization of Golgi and granule cell firing in a detailed network model of the cerebellar granule cell layer</a>	
<b>Neurolex IDs:</b>	<a href="#">Cerebellum granule cell</a> , <a href="#">Cerebellar, neuron</a>	
<b>References:</b>	<a href="#">ModelDB</a> <a href="#">Open Source Brain</a>	
<b>Keywords:</b>	None	
<b>Associated Channels:</b>	<a href="#">Gran_NaF_98 Channel</a> <a href="#">Gran_KDr_98 Channel</a> <a href="#">Gran_KCa_98 Channel</a> <a href="#">Gran_KA_98 Channel</a> <a href="#">Gran_H_98 Channel</a> <a href="#">Gran_CaPool_98 Channel</a> <a href="#">Gran_CaHVA_98 Channel</a> <a href="#">GranPassiveCond Channel</a>	
<b>Associated Synapses:</b>	<a href="#">AMPA_GranGol</a> <a href="#">GABA MF_AMPA</a> <a href="#">NMDA</a>	
<b>Associated Networks:</b>	<a href="#">Cerebellar Granule Layer Network</a>	
<b>NeuroML Files</b>	<a href="/var/www/NeuroMLmodels/NMLCL000002/Granule_98.morph.xml">/var/www/NeuroMLmodels/NMLCL000002/Granule_98.morph.xml</a>	



<http://neuroml.org>

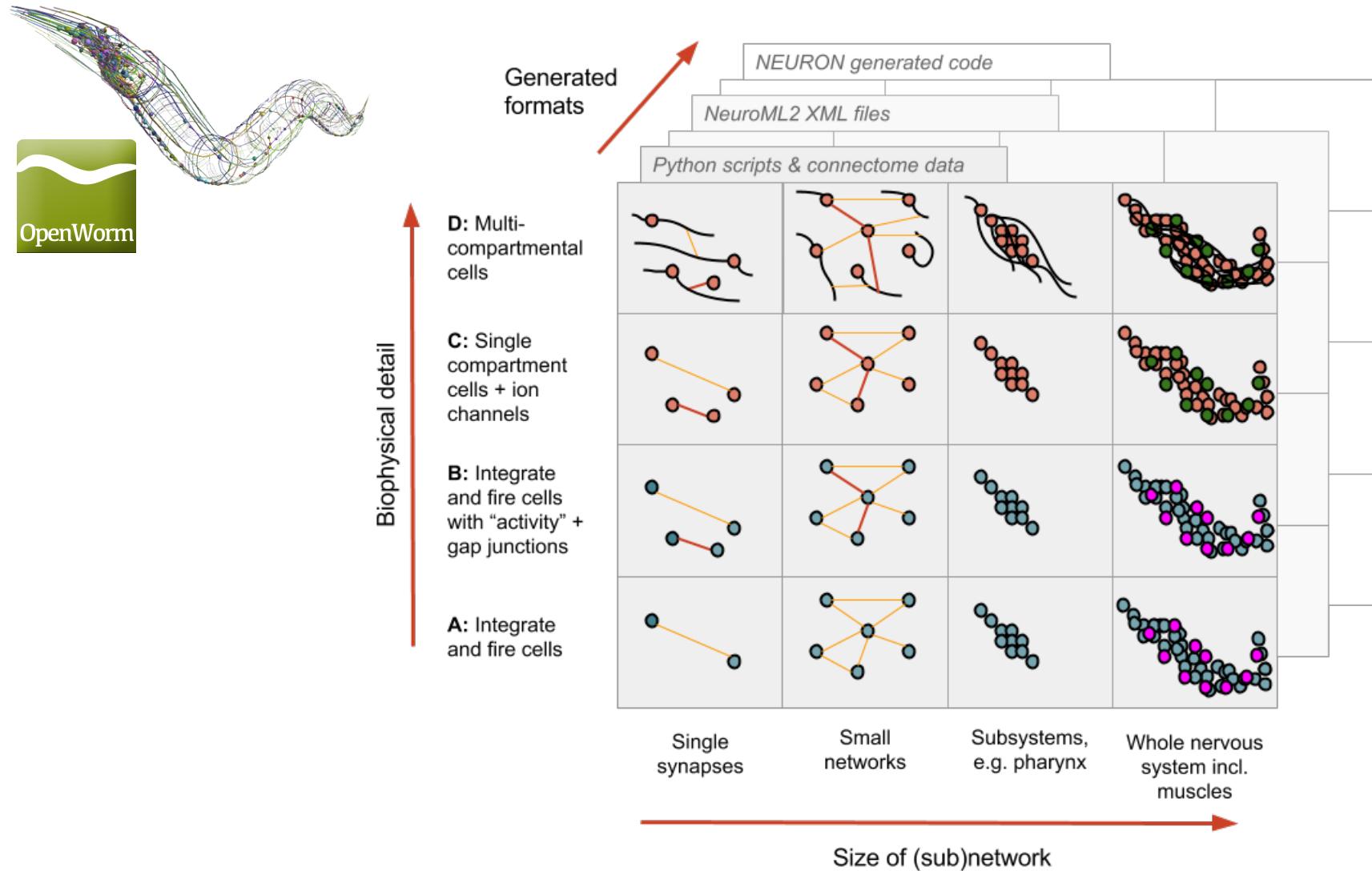
# Where is NeuroML going next?

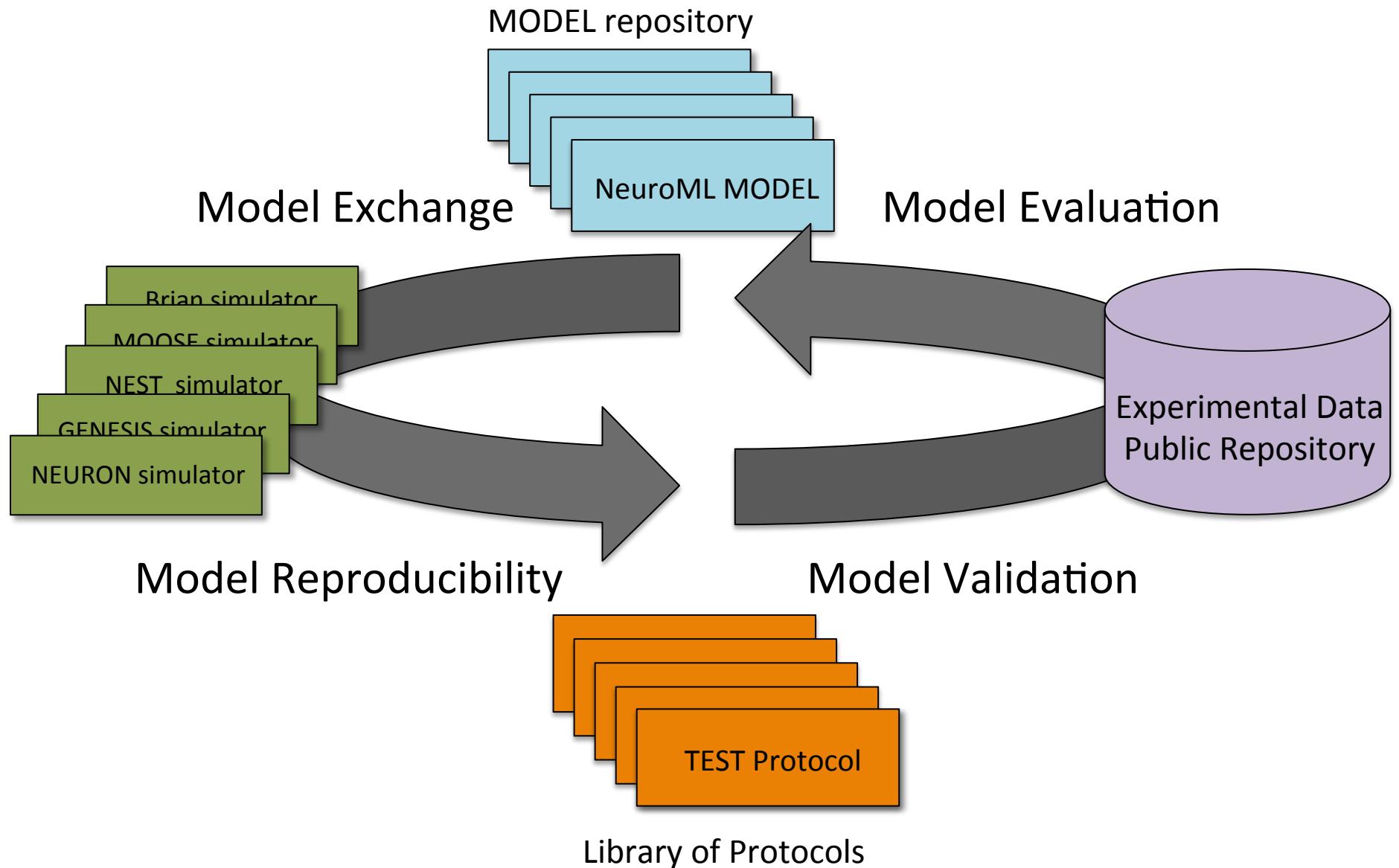
# NeuronUnit



C Granule Cell Models from OSB	Tests from NeuroElectro data	
	Resting Potential	Spike Width
Berends 2005	+1.15	<b>+0.18</b>
Maex 1998	+0.89	-1.71
Diwakar 2009	+1.10	<i>n/a</i>
Solinas 2010	<b>+0.13</b>	-3.18

## c302 - multiscale simulation framework for *C. elegans*





## What is NeuroML?

- Well-tested description language for multiscale models in neuroscience, including ion channels, dynamic synapses, morphologies, abstract cell models, and 3D network structure.

## Why do we need it?

- Important for model sharing, efficient model development, scientific reproducibility, and collaborative modeling.

## How can it be used with modeling tools?

- Over 40 simulators, databases, visualization tools, applications and libraries provide support for NeuroML, offering innovative pipelines.

## How does NeuroML support collaborative modeling?

- NeuroML-DB and Open Source Brain provide models and tools for model evaluation, re-use, and collaborative development.

## Where is it going next?

- Automated model validation and extensions/tools needed by the community.

## NeuroML Editorial Board



**New Board Members:**  
Andrew Davison  
Upi Bhalla

## Funding

*UK Group:* Medical Research Council, EUSynapse, Wellcome Trust

*Workshop Funding:* National Science Foundation, INCF

*US Group:* National Institutes of Health: NIMH, NIBIB