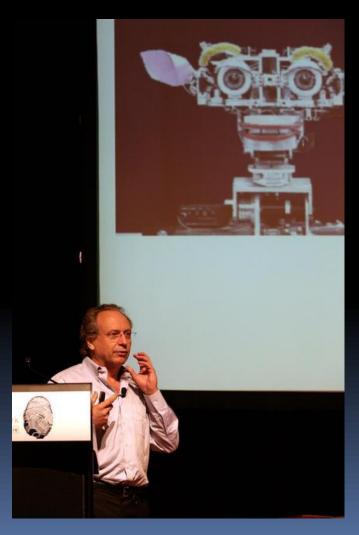
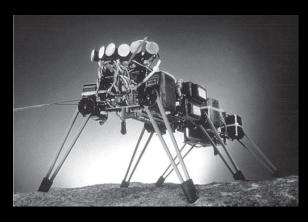
# Steps towards the Open Worm project

Stephen D. Larson
http://openworm.googlecode.com
NeuroML 3<sup>rd</sup> Annual Meeting
London, 4/1/2011

# What neuroscience can learn from AI: embodiment





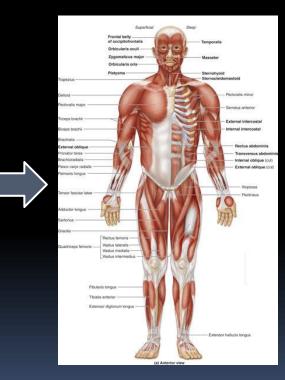


# What neuroscience can learn from AI: embodiment

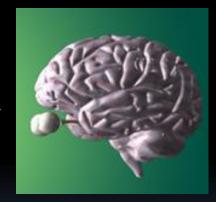


# What neuroscience can learn from AI: embodiment

World







# Virtual physical organisms in a computer simulation



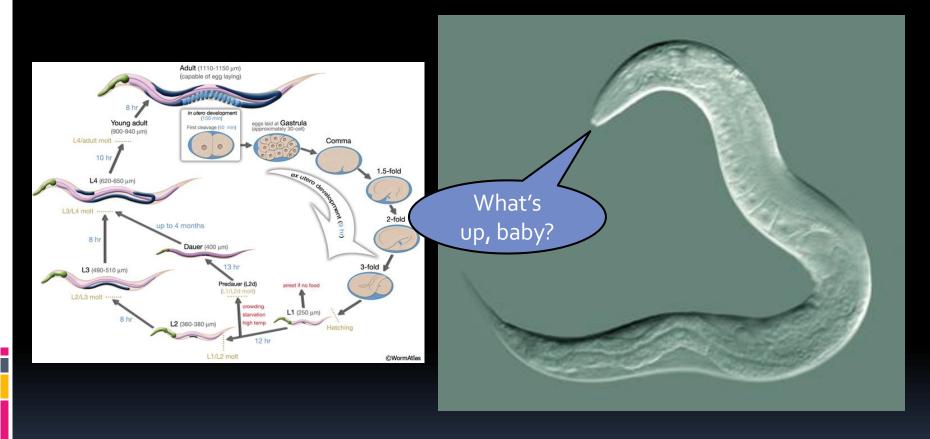


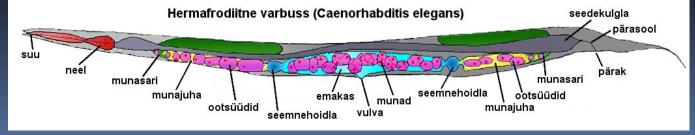






## Enter the worm: c. elegans

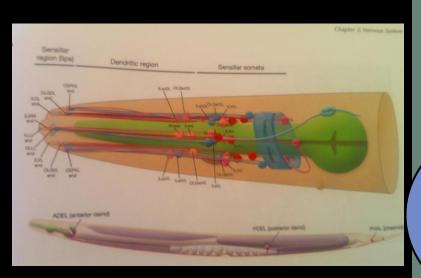




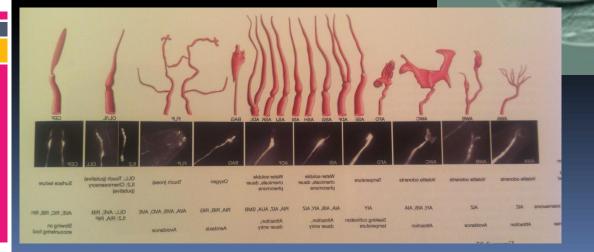
# In search of nature's design principles via simulation

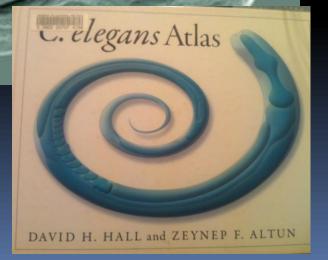
- How can a humble worm regulate itself?
  - Reproduces
  - Avoids predators
  - Survives in different chemical and temperature environments
  - Seeks and finds food sources in an ever changing landscape
  - Distributes nutrients across its own cells
  - Manages waste and eliminates it

## Enter the worm: c. elegans



I've only got 1000 cells in my whole body... please simulate me!

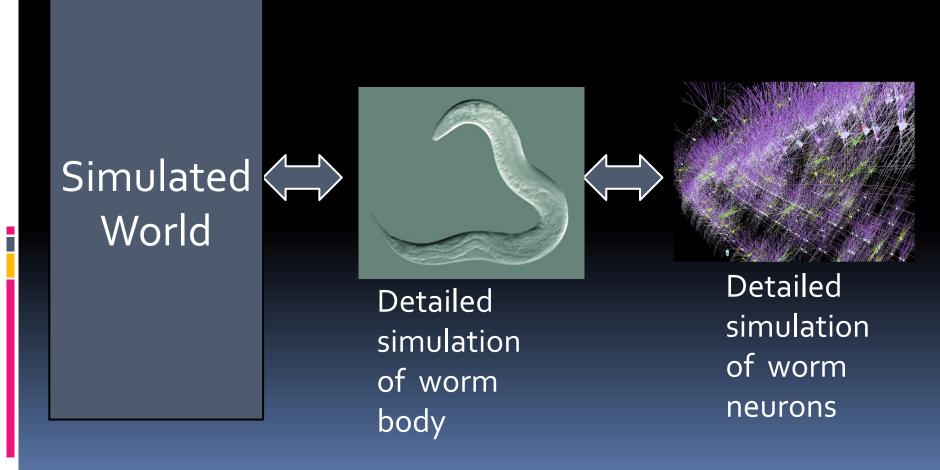




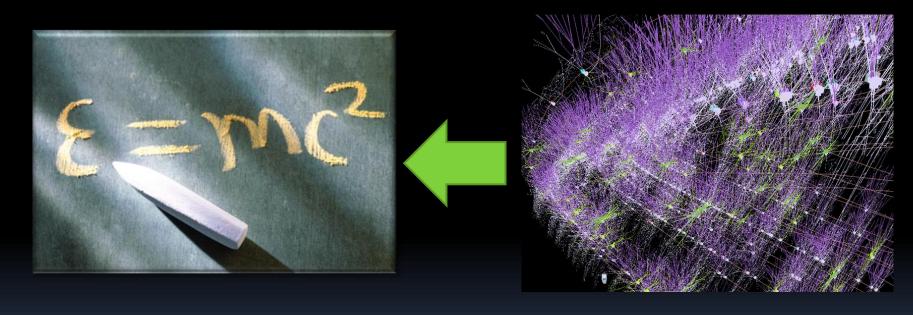
#### Worm structure

- ~1000 cells
- 302 neurons
- 5ok synapses
- 95 muscles

# A complete simulation of the worm's brain, body and environment



# The goal: understanding a faithfully simulated nervous system end to end



Extracting mathematical principles from simple nervous systems is necessary if we are going to understand and reconstruct the much larger nervous system of the human.

Outreach: put the model online and let the world

play with it

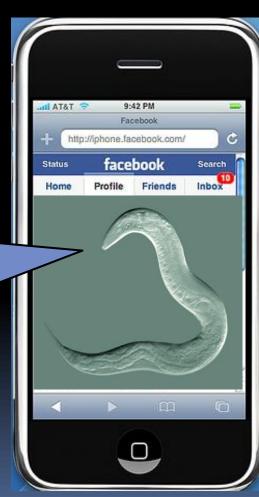
•Sex: Hermaphrodite

•Interested in:

Escaping my worm

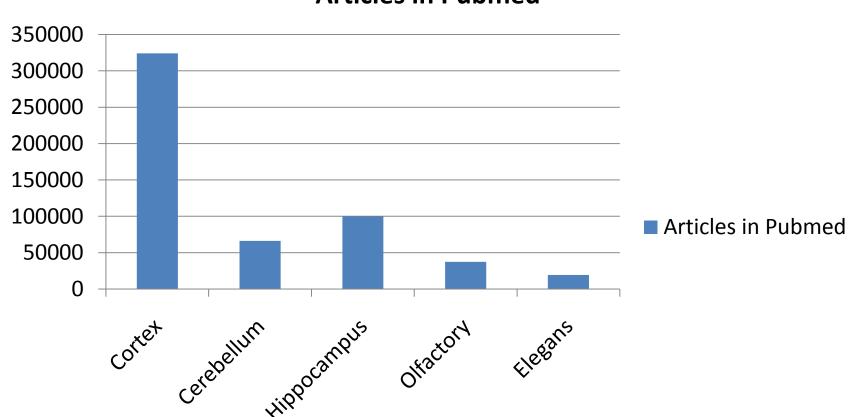
Matrix

•Relationship status: *Its complicated.* 

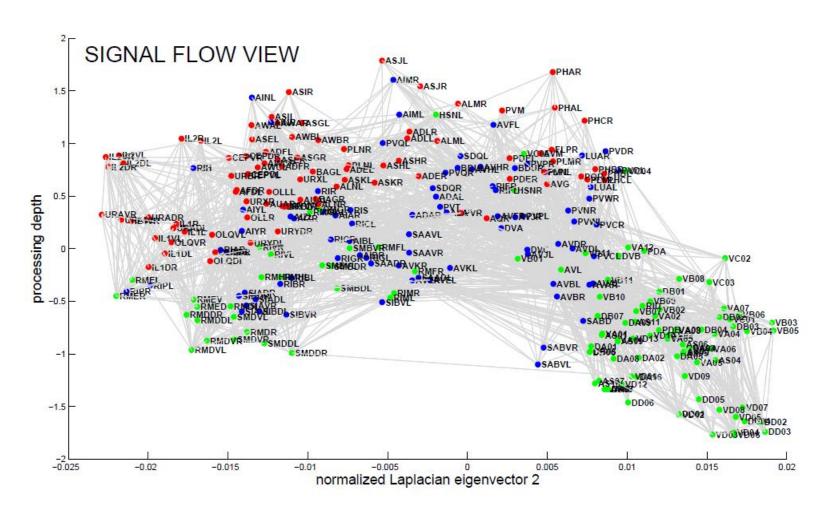


# How much do we know about the worm?

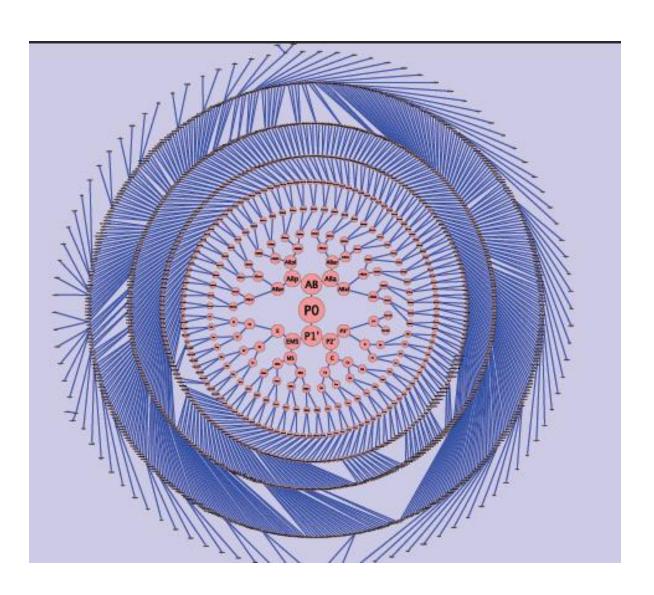
#### **Articles in Pubmed**

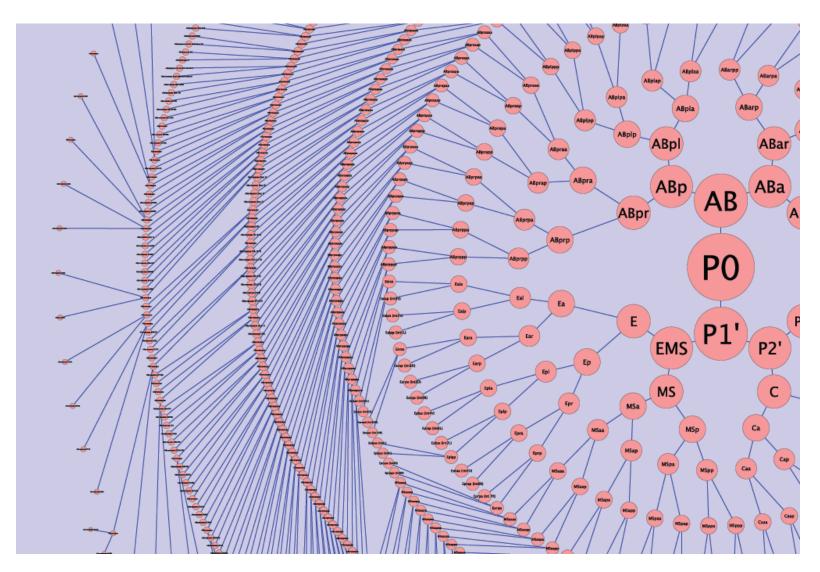


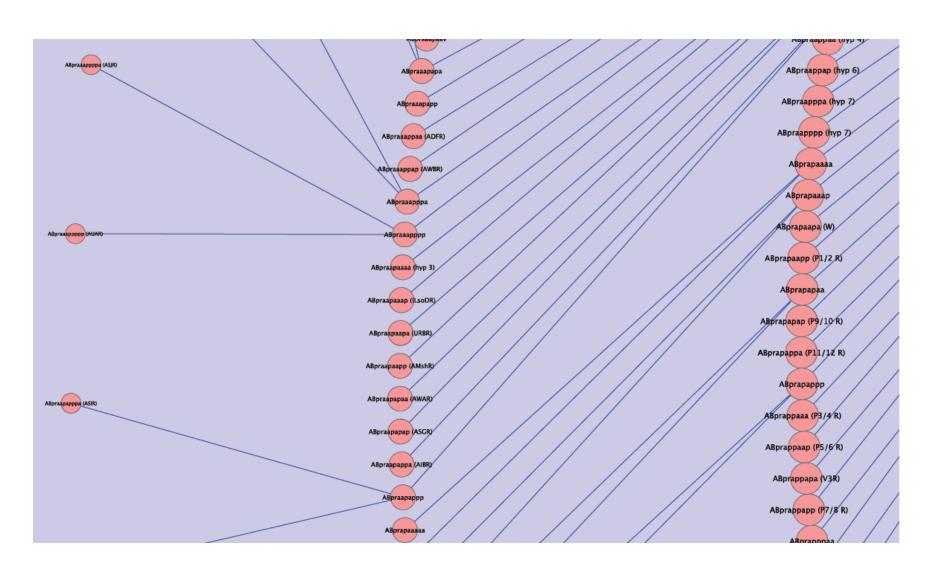
#### Full connectome

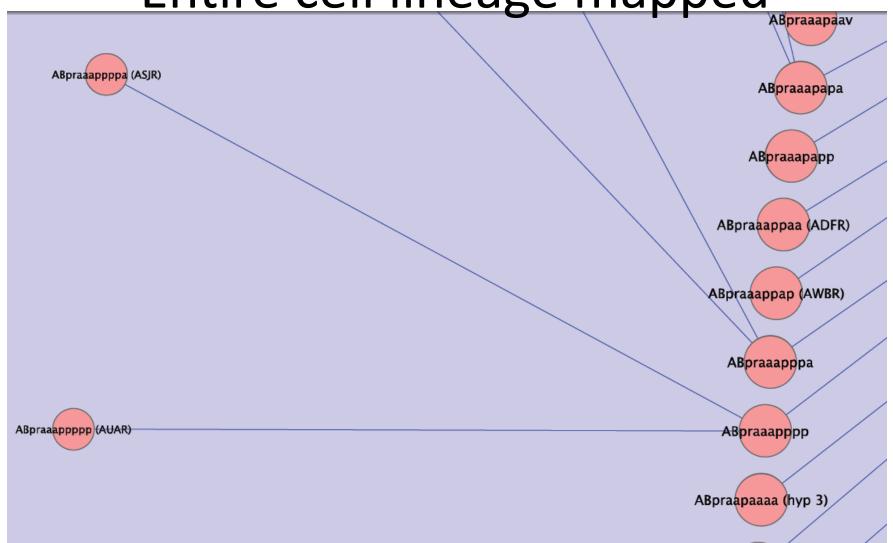


Varshney, Chen, Paniaqua, Hall and Chklovskii, 2011

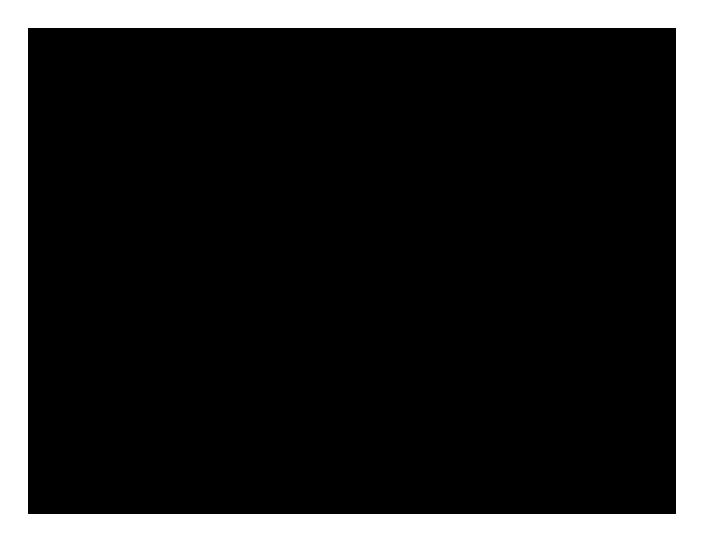








## Imaging of cellular dynamics

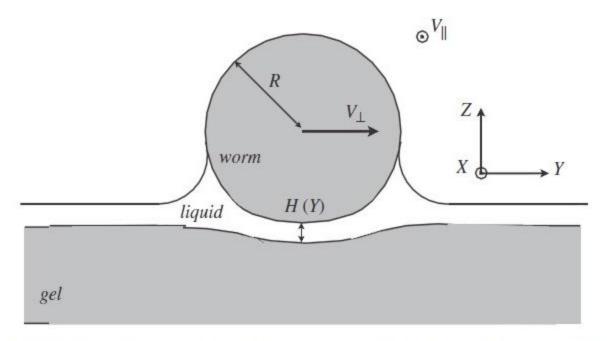


## **Behavior**



### Biomechanics

P. Sauvage et al. / Journal of Biomechanics



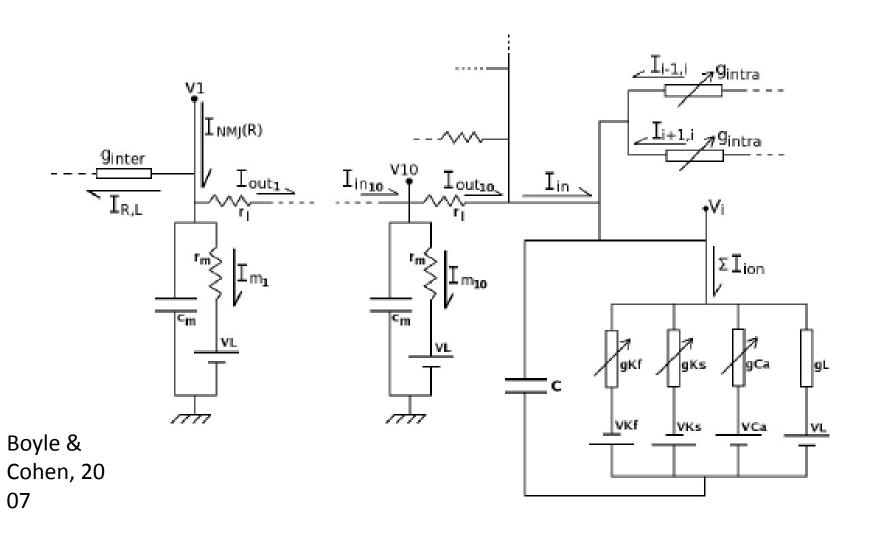
**Fig. 3.** Schematic representation of a cross-section of the worm. The worm (of radius R) is pinned down on the substrate by capillary forces created by the meniscus; the thickness of the lubrication film is noted H(Y) and the components of the velocity of the body section (with respect to the substrate) are  $V_{\perp}$  and  $V_{\parallel}$ .

#### Plan overview

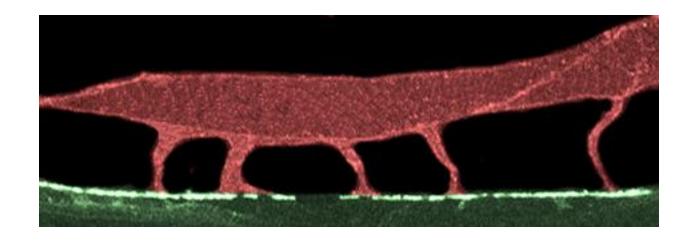
#### Sooner

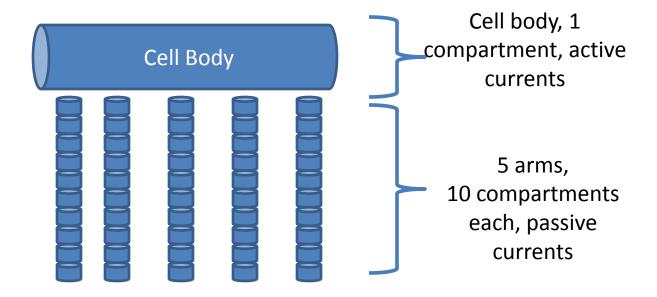
- Conductance based model of muscle cells
- Physical model of muscle cell forces
- Physical model of worm body with forces from environment

# Conductance model of c. elegans muscle cell



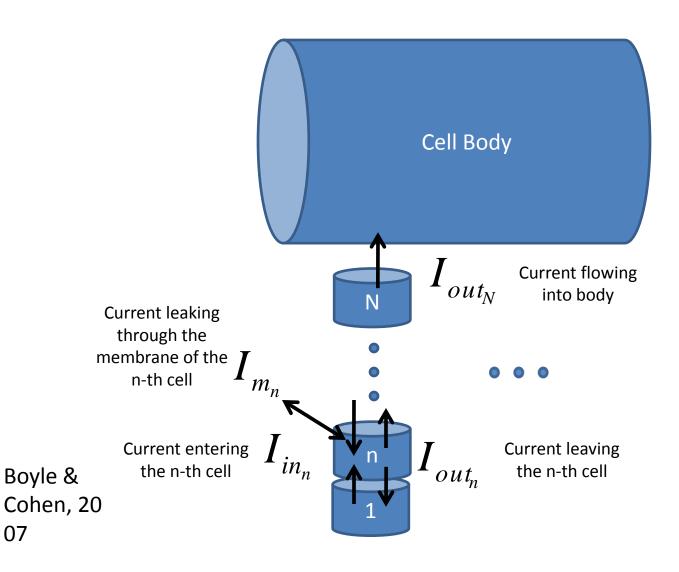
## Muscle cell with "arms"





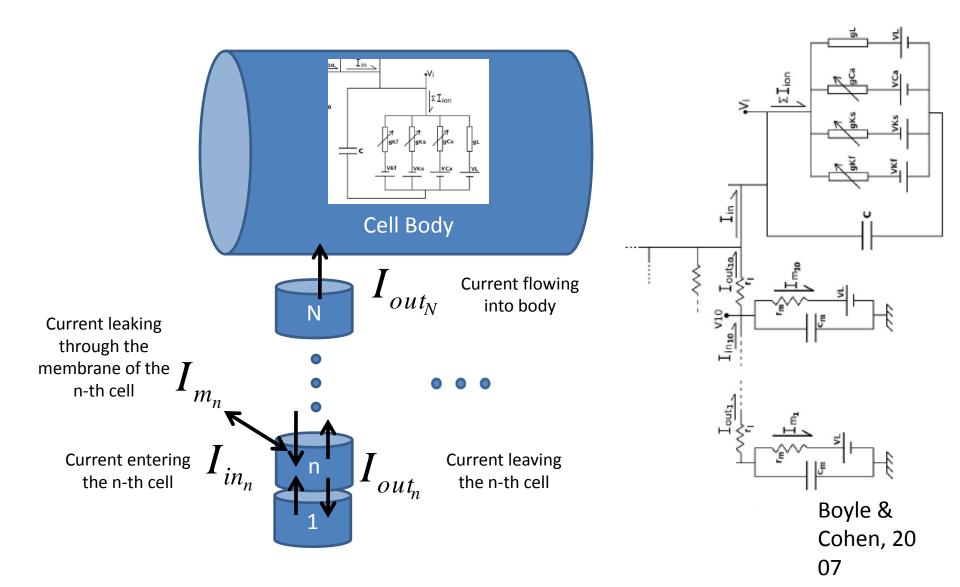
Boyle & Cohen, 20 07

#### The connectional currents

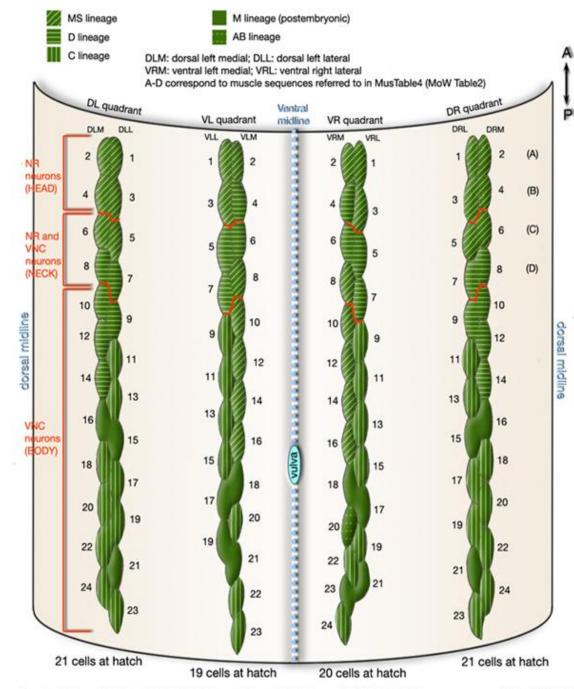


07

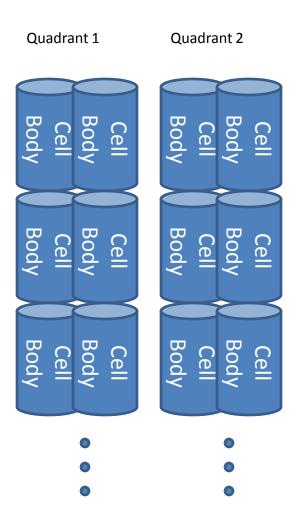
#### The connectional currents

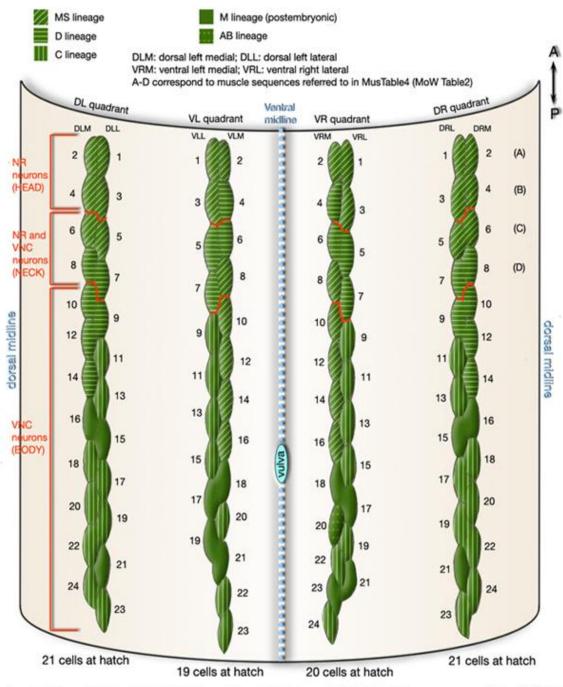


body wall muscle cells (adult worm) cell lineage shown:

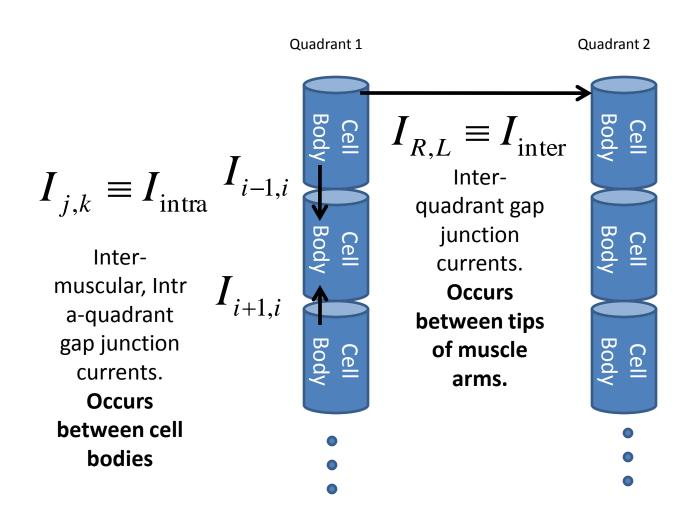


#### Quadrants of muscle cells

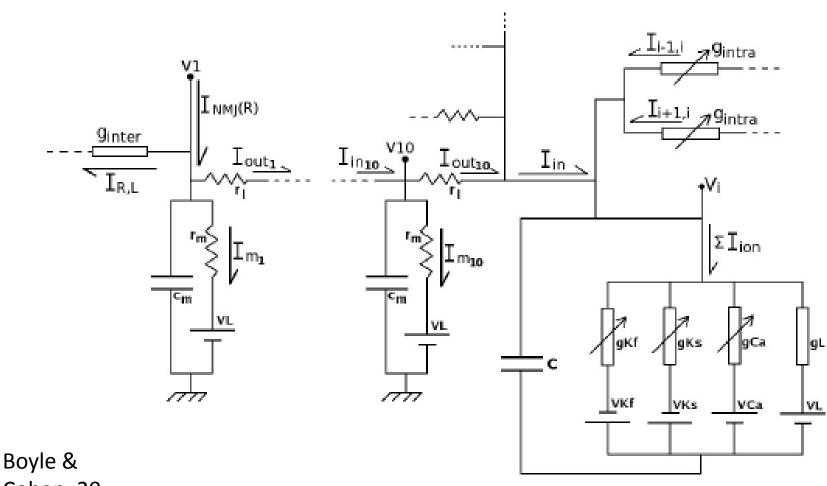




## Simplified quadrants of muscle cells

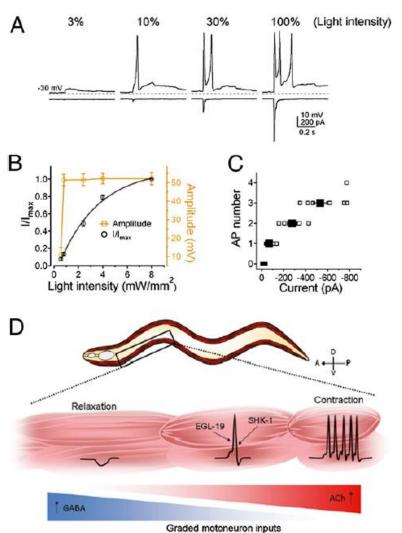


## Equivalent circuit diagram



Cohen, 20

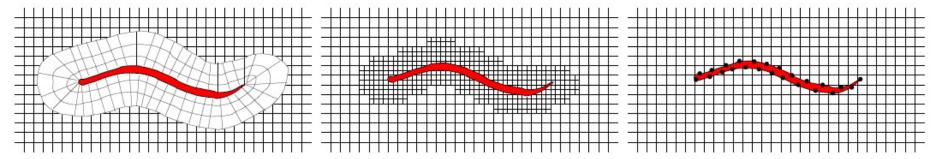
# Relationship between muscle action potentials and muscle contraction



# Contemplating options for physical body and environment simulation

#### Options:

- boundary-layer mesh joining regular mesh
- adaptive mesh-refinement of regular mesh
- immersed boundary method



<u>Simulation of swimming organisms: coupling internal mechanics with external fluid dynamics</u> (2004). R. Cortez, L. Fauci, N. Cowen, R. Dillon. Simulation of 3D c. elegans (interaction of an elastic structure with its surrounding fluid) is discussed among other things.

Modeling nematode swimming (2008) R. Tyson, J. Hebert, C. Jordan, L. Fauci.

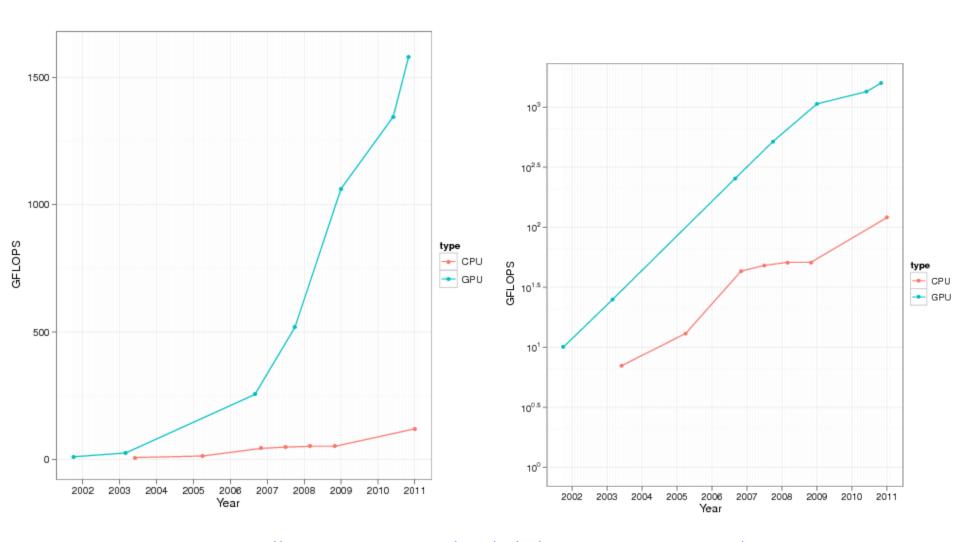
Options: boundary-layer mesh joining regular mesh /

adaptive mesh-refinement of regular mesh / immersed boundary method.

### Estimates of computational complexity

- Mechanical model
  - −~5 Tflops
- Muscle / Neuronal conductance model
  - −~240 Gflops

## GPU vs CPU performance increase



Source: <a href="http://csgillespie.wordpress.com/2011/01/25/cpu-and-gpu-trends-over-time/">http://csgillespie.wordpress.com/2011/01/25/cpu-and-gpu-trends-over-time/</a>

#### Plan overview

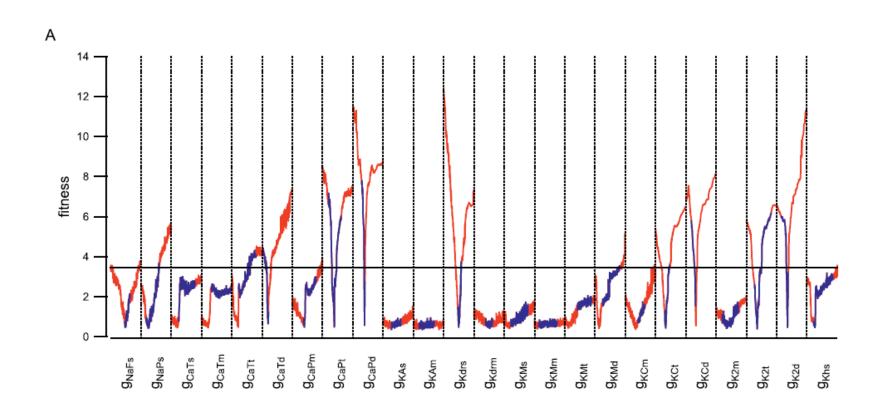
#### Sooner

- Conductance based model of muscle cells
- Physical model of muscle cell forces
- Physical model of worm body with forces from environment

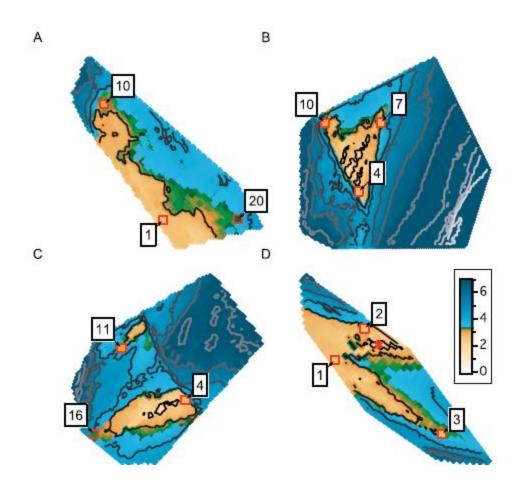
#### Later

- Conductance based model of neurons
- Diffusion based model of neurons
- **—** ...?
- Parameter optimization system...

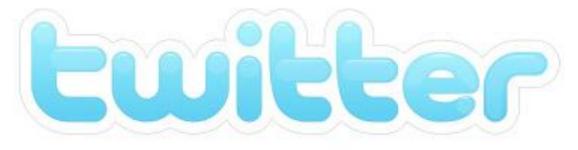
## Parameter optimization



# Parameter optimization



- Stephen Larson, Ph.d student, UC San Diego
- Marius Buibas, Ph.d student, UC San Diego





- Stephen Larson, Ph.d student, UC San Diego
- Marius Buibas, Ph.d student, UC San Diego
- Giovanni Idili, Software engineer, Cork, Ireland
- Tim Busbice, Senior software engineer, Los Angeles, CA
- Matteo Cantarelli, Software engineer, Cagliari, Italy
- Jay Coggan, Project scientist, Computational Neurobiology lab, Salk Institute



#### Mechanical model



Palayanov, Khayrulin, Dibert (submitted)

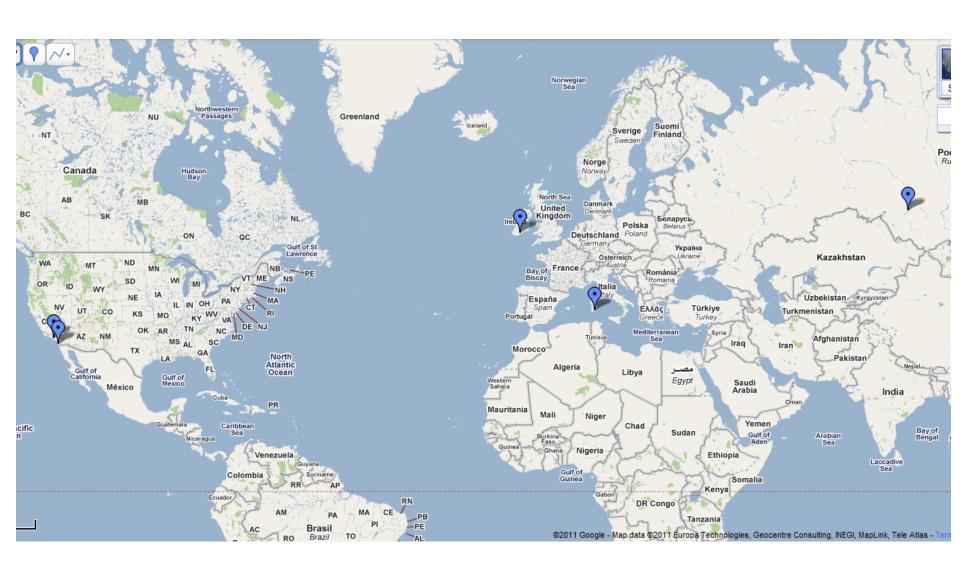
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- Matteo Cantarelli, Software engineer, Cagliari, Italy
- Jay Coggan, Project scientist, Computational Neurobiology lab, Salk Institute
- Andrey Palyanov, Project scientist, A.P. Ershov Institute of Informatics Systems SB RAS, Lab. of Complex Systems Simulation, Acad. Lavrentjev, Novosibirsk, Russia

## 3D body plan





- Stephen Larson, Ph.d student, UC San Diego
- Marius Buibas, Ph.d student, UC San Diego
- Giovanni Idili, Software engineer, Cork, Ireland
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- Christian Grove, Project scientist & curator, Wormbase, Caltech
- Sergey Khayrulin, Ph.d student A.P. Ershov Institute of Informatics Systems SB RAS, Lab. of Complex Systems Simulation, Acad. Lavrentjev, Novosibirsk, Russia



## Collaboration technologies used



















#### Contributions

- Explanation of role of embodiment in understanding interactive systems
- Description of the advantages of c. elegans as a model system
- Summarized key existing understanding of c. elegans biology
- Described steps towards implementing a multiscale, multi-algorithm c. elegans model
- Described a novel collaboration model for open source science and modeling