

#### **PCSIM** – Parallel neural Circuit SIMulator

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## Outline

- PCSIM overview
- Bidirectional Python interface
- Network construction framework
  - Basic constructs
  - Distributed wiring algorithms
    - Supported connectivity patterns
    - Efficiency and scaling



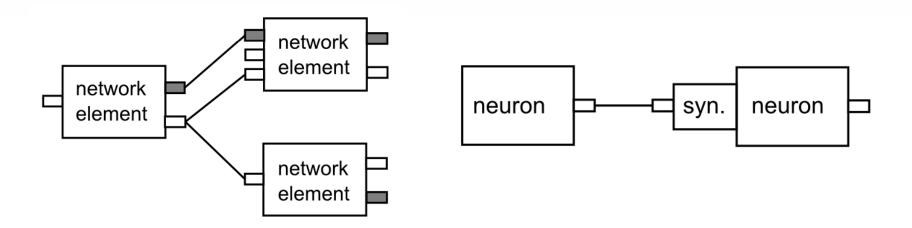
### PCSIM - Parallel neural Circuit SIMulator

- Supports distributed simulation of large spiking and analog neural networks with point neuron models.
- Implemented in C++ with a primary interface in Python
  - there is a new Java interface
- Runs under Linux, possible to port on other GNU based systems.
- Experimental support for loading NetworkML files
- Supports the standardized PyNN interface.



#### PCSIM - Parallel neural Circuit SIMulator Ctd.

- **Generic** network elements
  - multiple input and output, spiking and analog ports
  - suitable for hybrid simulations of spiking and analog elements, more abstract modules, neuromodulators.



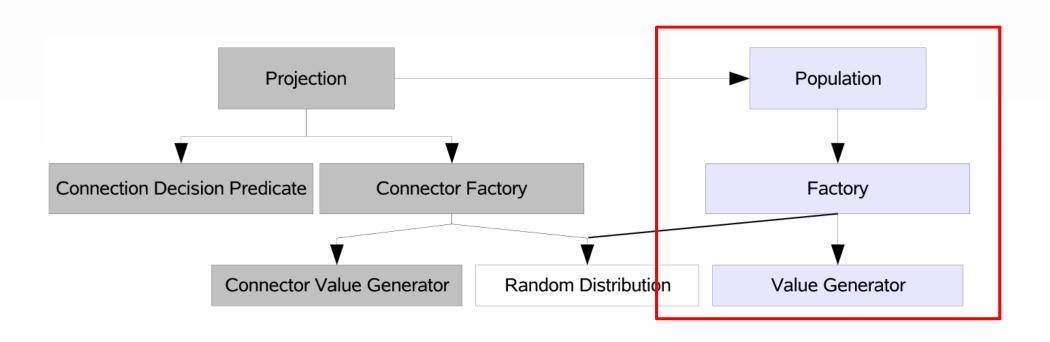


## Bidirectional Python Interface: Brian Network in PCSIM

```
class BrianCircuit(PySimObject):
                                                        net = SingleThreadNetwork()
  def __init__( self ):
                                                        pycirc = BrianCircuit()
                                                        pycirc id = net.add(pycirc)
   self.registerSpikingOutputPorts(arange(4000))
   self.registerSpikingInputPorts(arange(1000))
                                                        net.simulate(2.0)
   input = PCSIMInputNeuronGroup(1000, self)
    self.brian = brian.Network(input, P, Ce,
                                      Ci, Cinp )
                             1000 input
                                                                                    4000 output
                               ports
                                      BrianCircuit: PCSIM Network Element
                                                                                       ports
  def reset(self, dt):
  def advance(self, ai):
   self.brian.update()
                                                      Brian neural network in Python
   self.brian.clock.tick()
```

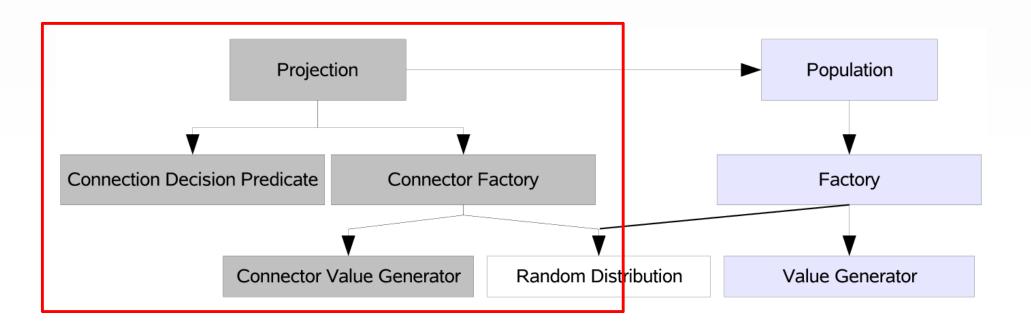


# **Network Construction: Creating Neurons**





## **Network Construction: Creating Connections**





## **Distributed Wiring Algorithms**

- Different types of connectivity patterns available
  - Random decision whether to make a connection sampled from a Bernoulli Distribution
  - Degree based the input/output degree of neurons is sampled from a arbitrary random distribution
  - Predicate based independently deciding for each pair of neurons whether to connect them, probabilistically, based on their attributes
- **Example**: creating patchy long -range lateral connections of V1 neurons (Buzas et al. 2006)
  - The probability to connect neurons i and j is

$$P(\mathbf{l_i}, \mathbf{l_j}, \phi_i, \phi_j) = C G(\mathbf{l_i}, \mathbf{l_j}) V(\phi_i, \phi_j)$$

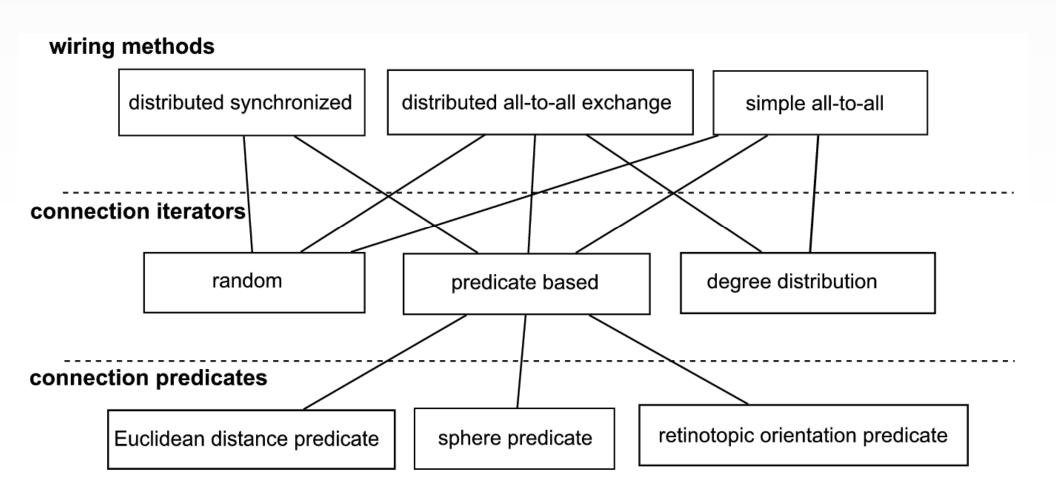
$$G(\mathbf{l_i}, \mathbf{l_j}) = e^{-\frac{|\mathbf{l_i} - \mathbf{l_j}|^2}{2\sigma^2}}$$

$$V(\phi_i, \phi_j) = e^{\kappa \cos 2(\phi_i - \phi_j)}$$

where  $I_i$  and  $I_j$  are the lateral coordinates,  $\phi_i$  and  $\phi_j$  are the orientation preferences of neurons i and j and C,  $\kappa$ ,  $\sigma$  are parameters.



## Three Levels of the Wiring Algorithms





## Wiring Methods

#### distributed synchronized

- Each node creates both its outgoing and incoming connections.
- no MPI communication
- A pair of nodes use the same RNG seeds when creating connections between them in order to synchronize.

#### distributed all-to-all exchange

- Each node creates its incoming connections.
- Created connections are communicated through MPI.

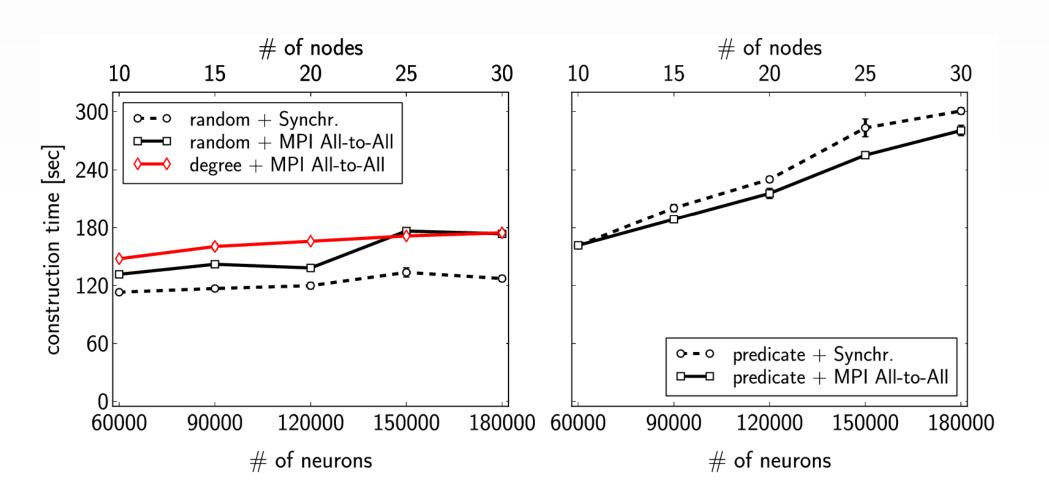


## Distributed Wiring Algorithms: Scalability

- We measured the construction time of a model where the number of used nodes increase proportionally with the number of neurons.
- In the performed experiments there are
  - 6000 neurons per node
  - on average 10000 input connections per neuron for all wiring algorithms
- Wiring methods tested:
  - Distributed Synchronized
  - Distributed All-To-All Exchange
- Wiring algorithms tested:
  - random
  - degree each neuron has exactly 10000 input connections
  - predicate distance dependent connection probability



## **Measured Construction Time**





## If you want to try out PCSIM

- The home page is: <a href="http://www.igi.tugraz.at/pcsim">http://www.igi.tugraz.at/pcsim</a>
  - User manual & examples
  - Tutorial & exercises
- The source is hosted at <a href="http://www.sourceforge.net/projects/pcsim">http://www.sourceforge.net/projects/pcsim</a>
- Active mailing list at Sourceforge
- Released under GNU Public License
- Publication about PCSIM

Pecevski D, Natschläger T and Schuch K (2009) PCSIM: a parallel simulation environment for neural circuits fully integrated with Python. *Front. Neuroinform.* 3:11.