



# PROGRAMMING NEUROGRID I *THE PYTHON WAY*

BEN VARKEY BENJAMIN

PEIRAN GAO

KWABENA BOAHEN

# Practical Stuff

- One Neurogrid system will be available for class with at least 16 chips--a million neurons!
- Access to Neurogrid will be time-shared through a sign up website after next Wednesday
- Available time slots depending on lab members' schedule;
- Both hardware and software are under constant state of development:
  - Expect frustrating bugs and crashes
  - TA and other lab members will be there to help
- Goal is to make the experience *mutually* beneficial for you and the lab

## Topics for Today:

- Synapse, Arbor, Soma and Neuron Models
- Hierarchical network constructs
- Making vertical (i.e., topographic) connections
- Mapping network to hardware
- Saving data from hardware (basic)

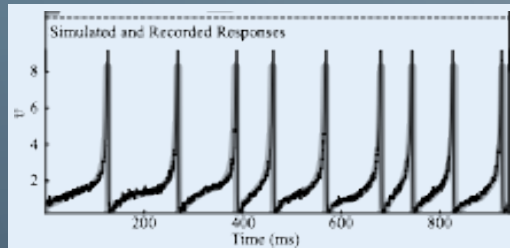
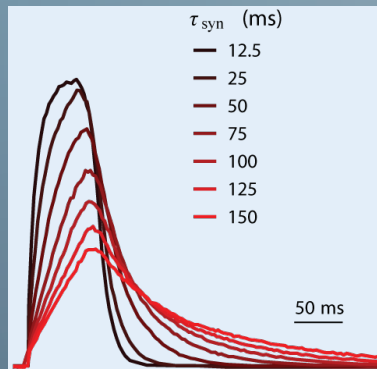
## Topics for Next Time:

- Making horizontal connections
- Sending stimulus
- Running experiments
- Possibly more....

# From NEST to Neurogrid

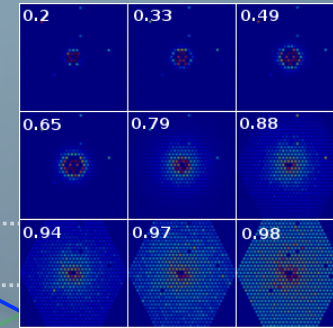
	NEST	Neurogrid
<i>Models</i>	Identical	Heterogeneous
<i>Network</i>	Flat, small	Hierarchical, large
<i>Speed</i>	Size-dependent	Real-time

# Hierarchical NeuronModel



SomaModel

Synapse+Arbor



NeuronModel

SomaModel

SynapseModel[0]

SynapseModel[1]

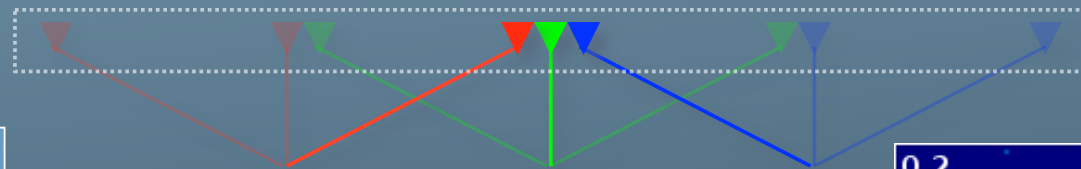
SynapseModel[2]

SynapseModel[3]

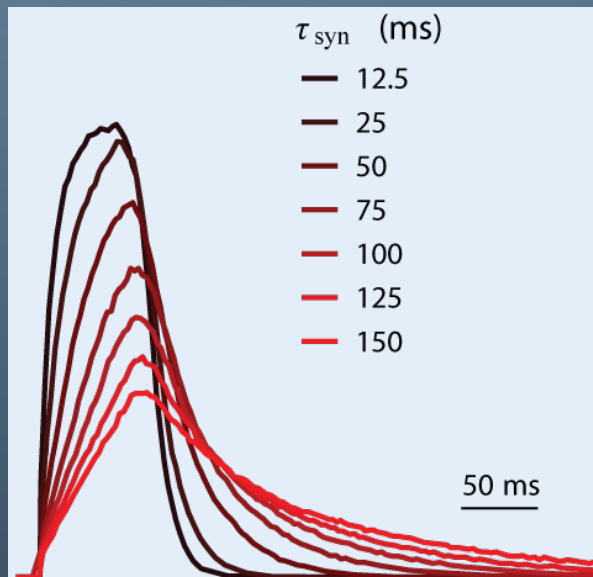
# Building Synapse and Arbor

```
>>> syn = Synapse("cond_syn", {"erev": .1, "g_max": 40, "tau_syn": 2e-3, "t_xmt": 5e-3, "lambda": .2})
```

Default parameter (shown) used if omitted

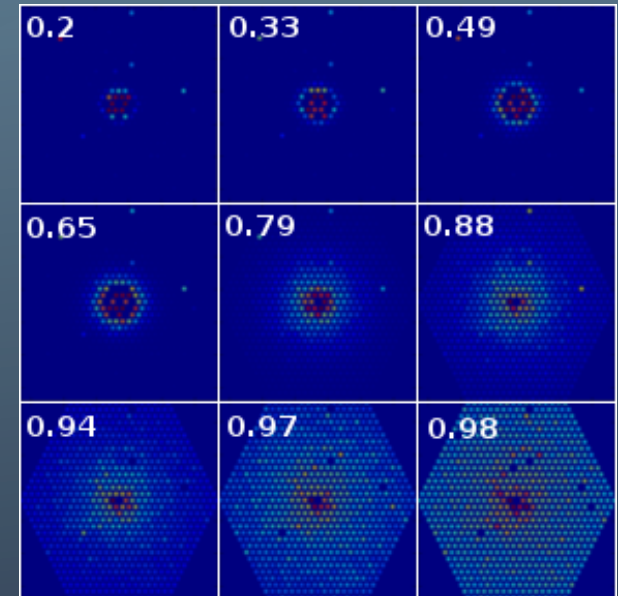


SynapseModel



Inhibitory:  $0 < erev < .5$   
 Shunting:  $.5 < erev < 1.5$   
 Excitatory:  $1.5 < erev$   
 Default:  $erev = 0.1$

SynapseArbor Model+



$$w(r) = \frac{1}{Z} \frac{\lambda^r}{\sqrt{r}}, \quad 0 < \lambda < 1$$

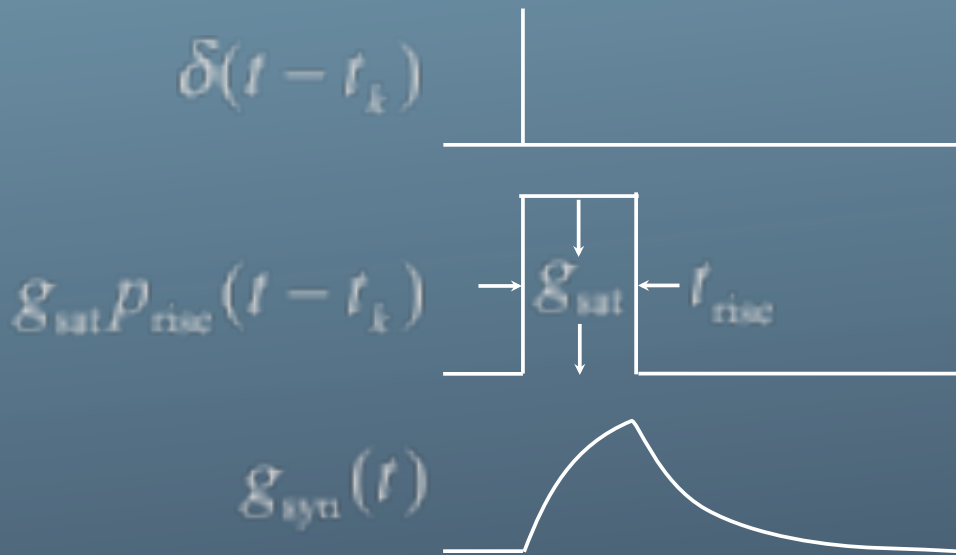
$$I_{syn} = g_{syn}(t)(E_{rev} - V_m)$$

$$\tau_{syn} \dot{g}(t) = -g(t) + \sum_i pulse(t - t_i)$$

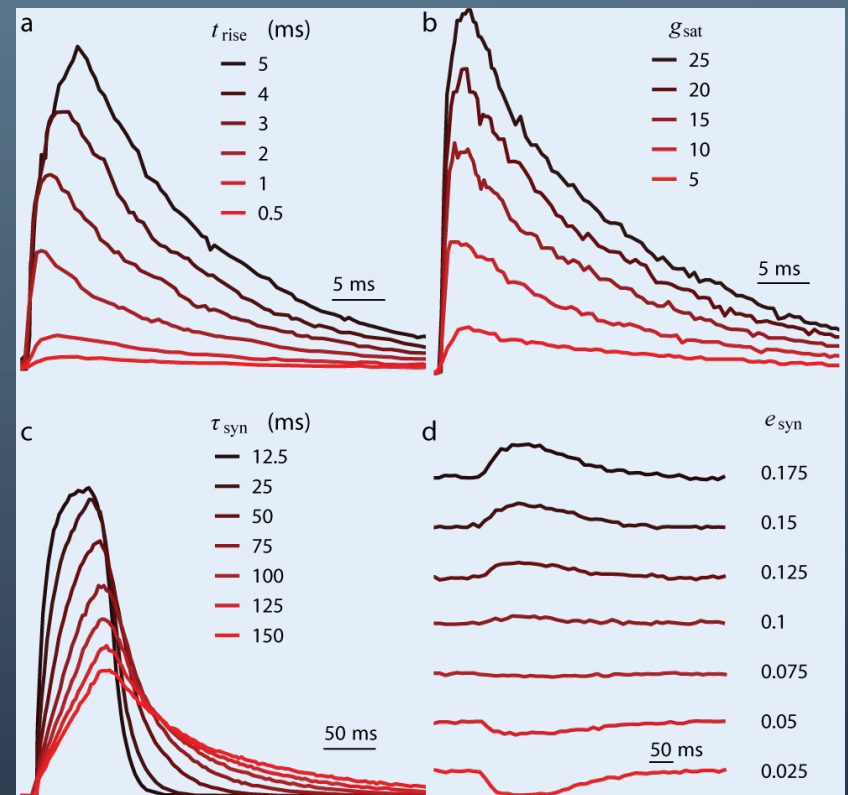
Normalized such that total conductance equals  $g_{syn}(t)$

# SYNAPSE DYNAMICS

$$\tau \dot{g}_{\text{syn}} = -g_{\text{syn}} + g_{\text{sat}} p_{\text{rise}}(t)$$



- The cleft sets  $g_{\text{syn}}(t)$ 's rise time,  $t_{\text{rise}}$ , by producing a unit pulse,  $p_{\text{rise}}(t)$ , with width  $t_{\text{rise}}$ .
- The receptor sets  $g_{\text{syn}}(t)$ 's steady-state value,  $g_{\text{sat}}$ , by scaling  $p_{\text{rise}}(t)$ , and its time constant,  $\tau_{\text{syn}}$ .



# Building Soma and Neuron

Default parameters (shown) used if omitted

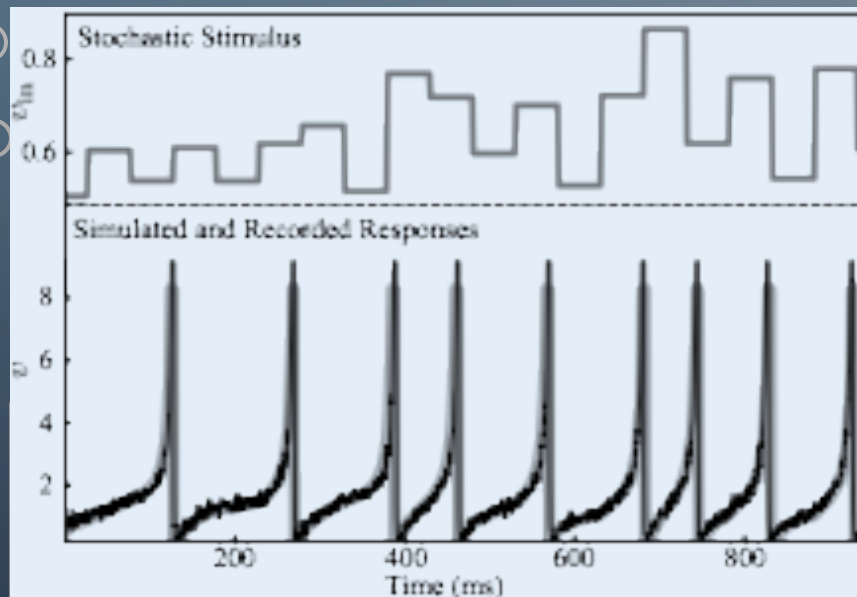
```
>>> som_quad = Soma("quadratic", {"x0": .9, "tau": 10e-3, "tau_ref": 2e-3})
>>> nrn_quad = Neuron("quad_neuron", som_quad)
>>> som_cub = Soma("cubic", {"x0": .385, "tau": 10e-3, "tau_ref": 2e-3})
>>> nrn_cub = Neuron("cub_neuron", som_cub)
>>> som_quad_ad = Soma("quadratic_adaptive", {"x0": .5, "tau": 10e-3, "tau_ref": 2e-3, "g_inf": 0.02})
>>> som_cub_ad = Soma("cubic_adaptive", {"x0": .385, "tau": 10e-3, "tau_ref": 2e-3, "g_inf": 0.02})
```

Quadratic Model:

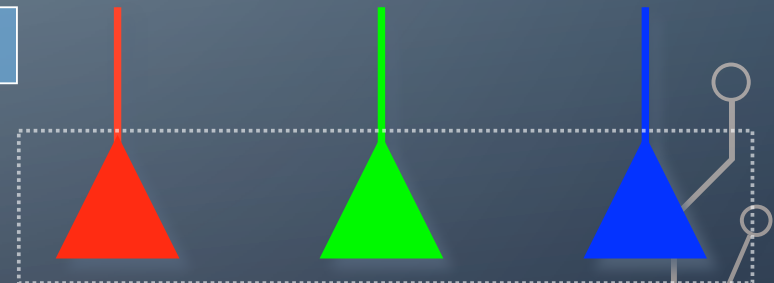
$$\tau \dot{x} = -x + \frac{1}{2}x^2 + x_0, t_{ref}$$

Cubic Model:

$$\tau \dot{x} = -x + \frac{1}{3}x^3 + x_0, t_{ref}$$



SomaModel

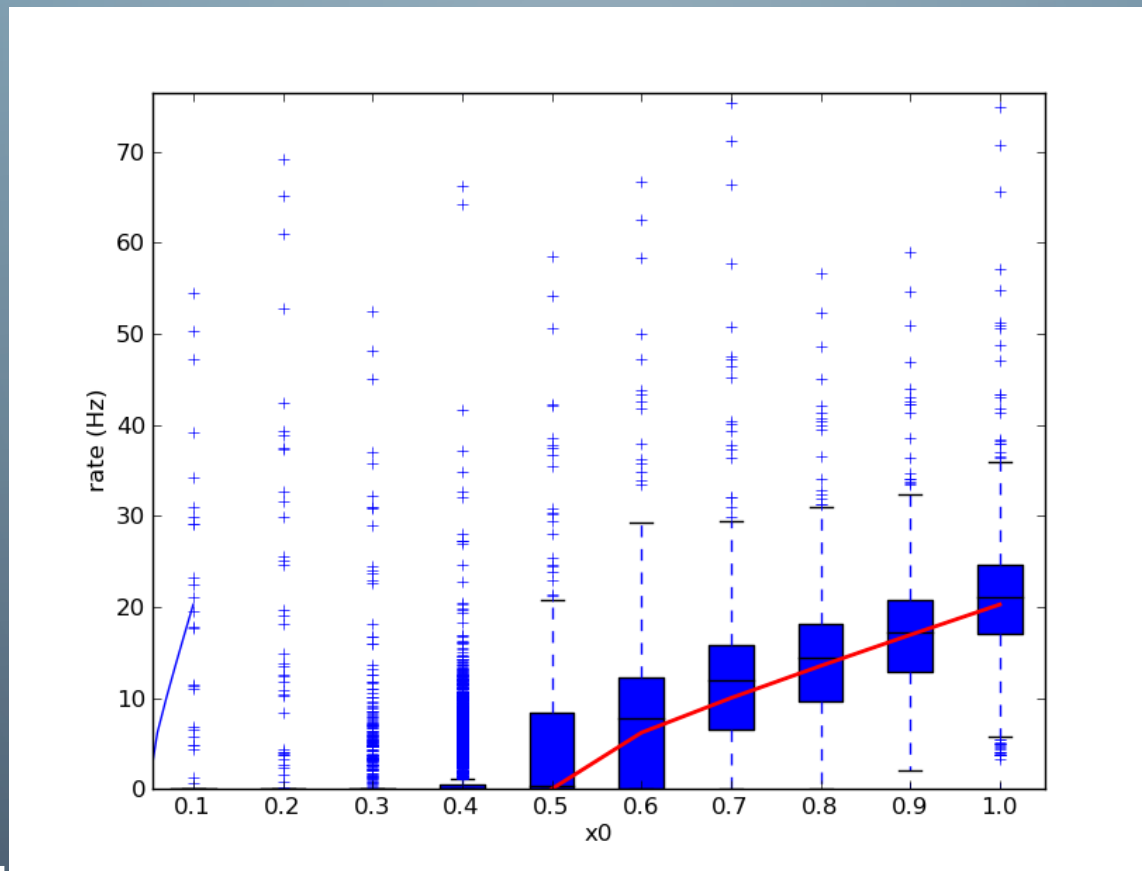




# Bring the Neuron Model Together

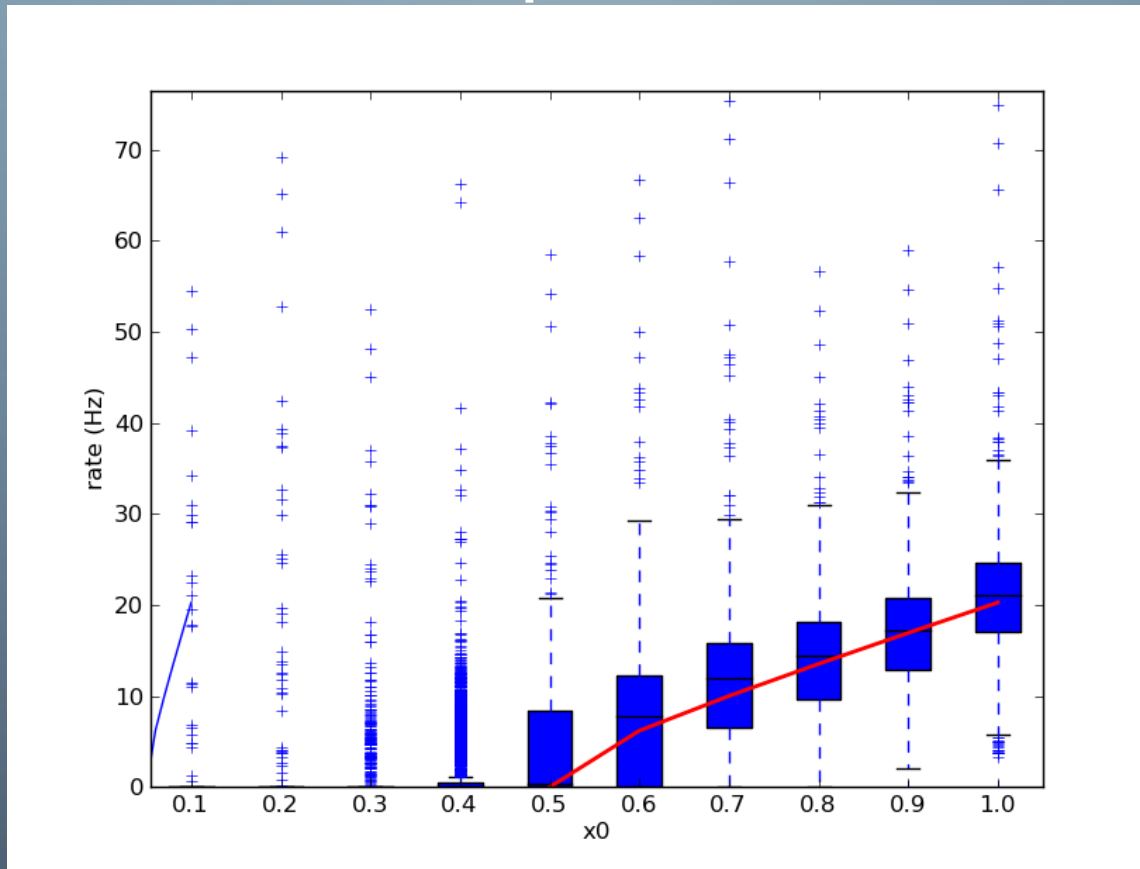
```
>>> # Making inhibitory synapse and arbor
>>> syn_i = Synapse("cond_syn", {"erev": .5, "tau_syn": 10e-3, "lambda": .8})
>>>
>>> # Making excitatory synapse and arbor
>>> syn_e = Synapse("cond_syn", {"erev":2.5, "tau_syn": 2e-3, "lambda": .8})
>>>
>>> # Making quadratic SomaModel
>>> som_quad = Soma("quadratic", {"x0": .9, "tau": 10e-3})
>>>
>>> # Add arbors to the soma
>>> som_quad.AddASynapse(arb_e)
>>> som_quad.AddSynapse(arb_i)
>>>
>>> # Putting together the Neuron model
>>> nrn_quad = Neuron("quad_neuron", som_quad)
```

# Driving neuron with input current



- Neurons are heterogeneous Peiran's data
- Mean rate matches theory (red)
- Rate increases sublinearly (square root for quadratic)
- Starts spiking at  $x_0 > 0.5$

# Show firing rate distribution and biological comparison

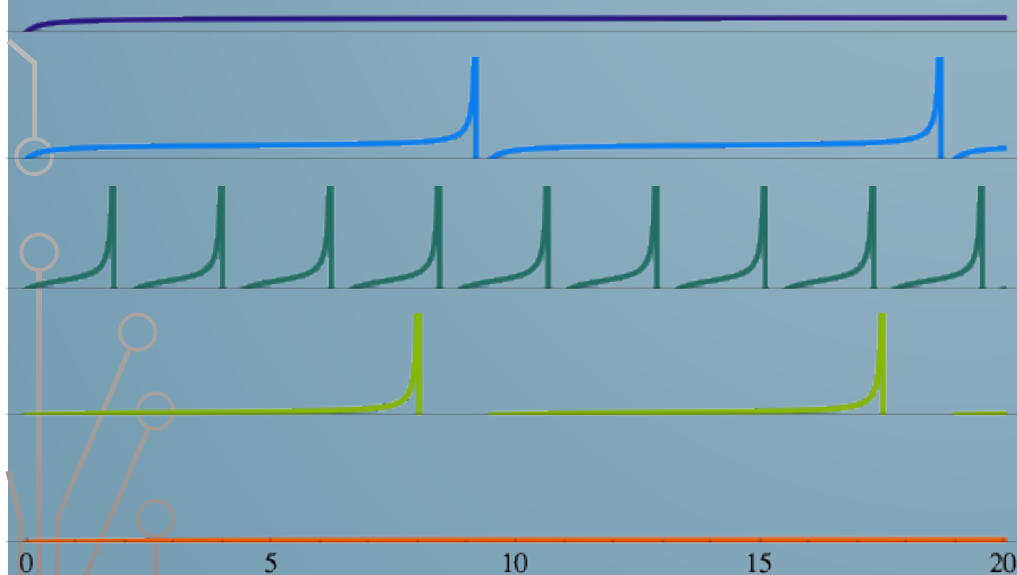


- Starts spiking at  $x_0 > 0.5$
- Rate increases sublinearly (square root for quadratic)
- Neurons are heterogeneous

# DRIVING NEURON WITH SYNAPSE

Analytic membrane potential

$$e_{\text{rev}} = 4, g^{*-} = 0.17, g^{*+} = 5.83$$



- Quadratic positive-feedback can't overcome conductances larger than a maximum value ( $g^{*+}$ )
- Such large shunts hold the membrane potential close to  $e_{\text{rev}}$ , preventing spiking even when  $e_{\text{rev}} \gg 1$

The slide features a dark blue gradient background. In the four corners, there are decorative white line-art patterns resembling circuit board traces and nodes. The top-left and bottom-left corners have more complex, branching patterns, while the top-right and bottom-right corners have simpler, more linear patterns.

Next week

Neurogrid III lecture on building networks