









http://www.briansimulator.org

### **Romain Brette**

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Main developers of Coodman & Marcel Stimberg



# Installing



#### briansimulator.org



The Brian spiking neural network simulator

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About the new website

#### Releases

2.0

New alpha version of Brian 2 Yet another alpha version of Brian 2.0 New alpha version of Brian

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The following code defines a randomly connected network of integrate and fire neurons with exponential inhibitory and excitatory currents, runs the simulation and makes the raster plot on the right.

```
from brian import *
      dv/dt = (ge+gi-(v+49*mV))/(20*ms) : volt
     dge/dt = -ge/(5*ms) : volt
      dgi/dt = -gi/(10*ms) : volt
     P = NeuronGroup(4000, eqs, threshold=-50*mV, reset=-60*mV)
      P.v = -60*mV
      Pe = P.subgroup(3200)
10
     Pi = P.subgroup(800)
11
     Ce = Connection(Pe, P, 'ge', weight=1.62*mV, sparseness=0.02)
Ci = Connection(Pi, P, 'gi', weight=-9*mV, sparseness=0.02)
12
13
     M = SpikeMonitor(P)
14
      run(1*second)
15
      raster_plot(M)
16
     show()
```

The efficiency of Brian relies on vectorised computations (using NumPy), so that the code above is only about 25% slower than C.

See the demo and the manual (also available at brian.readthedocs.org) for more examples.

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Follow Brian on Twitter and Facebook!

# The spirit of



"A simulator should not only save the time of processors, but also the time of scientists"



scientist



computer

Writing code often takes more time than running it

## Goals:

- Quick model coding
- Flexible



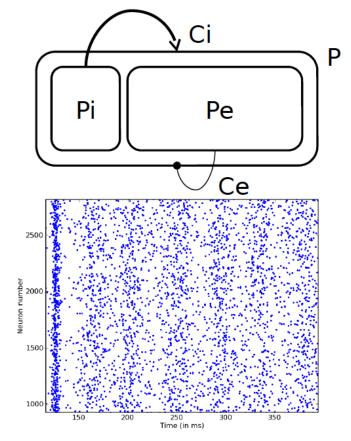
models are defined by equations (rather than pre-defined)

# An example

#### from brian2 import \*

```
tau_m = 20*ms
tau e = 5*ms
                      Stimberg M, Goodman DFM, Benichoux V, Brette R (2014). Equation-
tau i = 10*ms
                      oriented specification of neural models for simulations. Frontiers
V_th = -50*mV
                      Neuroinf, doi: 10.3389/fninf.2014.00006.
E L = -60*mV
I const = 11*mV
eas = '''
dv/dt = (-(v-E_L) + I_{const} + g_e + g_i)/tau_m : volt
dg_e/dt = -g_e/tau_e : volt
dg i/dt = -g i/tau i : volt
P = NeuronGroup(4000, model=eqs,
                threshold='v>V th', reset='v=E L')
P.v = 'E L+10*mV*rand()'
Pe = P[:3200]
Pi = P[3200:]
w_e = 1.62*mV
w i = 9*mV
Ce = Synapses(Pe, P, pre='q e+=w e')
Ci = Synapses(Pi, P, pre='g i-=w i')
Ce.connect(True, p=0.02)
Ci.connect(True, p=0.02)
M = SpikeMonitor(P)
run(1*second)
plot(M.t/ms, M.i, '.')
xlabel('Time (in ms)'); ylabel('Neuron number')
show()
```

$$au_m rac{\mathrm{d}V}{\mathrm{d}t} = -(V - E_L) + g_e + g_i$$
 $au_e rac{\mathrm{d}g_e}{\mathrm{d}t} = -g_e$ 
 $au_i rac{\mathrm{d}g_i}{\mathrm{d}t} = -g_i$ 



# Standardization issues

Key issue: each simulator has its own language, how to communicate models?

Example 1: PyNEST (Python interface to NEST)

Component-based approach:
you need to know what the components are exactly
you need to know parameter names
you need to know implicit units

## Standardization issues

Solution: *equation-oriented approach* 

Example 2: NineML (Izhikevich model)

#### Issues:

- can't specify a full simulation (including initialization & stimulus)
- heavy!

```
<?xml version='1.0' encoding='UTF-8'?>
<NineML xmlns="http://nineml.org/9ML/0.1">
    xmlns:xsi="http://www.w3.org/2001/XMLSchema-instance"
    xsi:schemaLocation="http://nineml.org/9ML/0.1 NineML\ v0.2.xsd">
  <ComponentClass name="izhikevichCellNew">
    <Parameter name="a" dimension="none"/>
    <Parameter name="c" dimension="voltage"/>
    <Parameter name="b" dimension="per time"/>
    <Parameter name="d" dimension="voltage per time"/>
    <Parameter name="theta" dimension="voltage"/>
    <AnalogPort name="iSyn" mode="reduce" reduce_op="+" dimension="current"/>
    <AnalogPort name="U" mode="send" dimension="none"/>
    <AnalogPort name="V" mode="send" dimension="voltage"/>
    <EventPort name="spikeOutput" mode="send"/>
    <Dvnamics>
        <StateVariable name="V" dimension="voltage"/>
        <StateVariable name="U" dimension="voltage per time"/>
        <Alias name="rv" dimension="none">
            <MathInline>V*II</MathInline>
        </Alias>
        <Regime name="subthresholdRegime">
          <TimeDerivative variable="U">
            <MathInline>a*(b*V - U)</MathInline>
          </TimeDerivative>
          <TimeDerivative variable="V">
            <MathInline>0.04*V*V + 5*V + 140.0 - U + iSyn</MathInline>
          </TimeDerivative>
          <OnCondition>
            <Trigger>
              <MathInline>V \> theta </MathInline>
            </Trigger>
            <StateAssignment variable="V" >
              <MathInline>c</MathInline>
            </StateAssignment>
            <StateAssignment variable="U" >
             <MathTnline>U+d</MathInline>
            </StateAssignment>
            <EventOut port="spikeOutput" />
          </OnCondition>
        </Regime>
    </Dvnamics>
  </ComponentClass>
</NineML>
```

# Standardization issues: the



Goal: to minimize « language entropy » = uncertainty about syntax and names, given the meaning

Brette R (2012). On the design of script languages for neural simulation. Network 23(4), 150-156

### Key points:

- 1) There is already an accepted standard for models: math!
- 2) If you specify names, units and equations yourself, you don't need to know them in advance
- 3) Full expressivity requires a programming language

## Standardization issues: the



```
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tau e = 5*ms
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P.v = 'E L+10*mV*rand()'
Pe = P[:3200]
Pi = P[3200:1]
w_e = 1.62*mV
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Ce = Synapses(Pe, P, pre='g_e+=w e')
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Ce.connect(True, p=0.02)
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M = SpikeMonitor(P)
run(1*second)
plot(M.t/ms, M.i, '.')
xlabel('Time (in ms)'); ylabel('Neuron number')
show()
```

# Standardization issues: the



```
S = Synapses(source_group, target_group,

'''w : siemens

dA_source/dt = -A_source/tau_source : siemens (event-driven)

dA_target/dt = -A_target/tau_target : siemens (event-driven)''',

pre='''g_post += w

A_source += deltaA_source

w = clip(w+A_target, 0*siemens, w_max)''',

post='''A_target += deltaA_target

w = clip(w+A_source, 0*siemens, w_max)''''
)
```

Stimberg M, Goodman DFM, Benichoux V, Brette R (2014). **Equation-oriented specification of neural models for simulations**. Frontiers Neuroinf, doi: 10.3389/fninf.2014.00006

# The future of

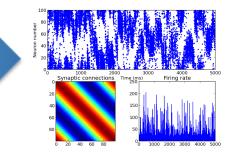




## relies on code generation to run on multiple targets

```
# Neurons
input = PoissonGroup(N, rates=F)
neurons = NeuronGroup(1, '''dv/dt = (g e^*(E e-v r)+E l-v)/tau m : volt
                            dg_e/dt = -g_e/tau_e : 1''',
                      threshold='v>vt', reset='v=v_r')
# Synaptic connections
S = Synapses(input, neurons,
                dApre/dt = -Apre/taupre : 1 (event-driven)
                dApost/dt = -Apost/taupost : 1 (event-driven)''',
             pre='''ge += w
                    Apre += dApre
                    w = clip(w+Apost, 0, gmax)''',
             post='''Apost += dApost
                     w = clip(w+Apre, 0, gmax)''',
             connect=True)
S.w = 'rand()*gmax'
```

### Simulation on PC, clusters, GPU







Interface with robots



Embedded simulation on Android smartphones





## Documentation

#### briansimulator.org



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New alpha version of Brian 2 Yet another alpha version of Brian 2.0 « What is computational neuroscience? (XVIII) Representational approaches in computational neuroscience

What is computational neuroscience? (XVII) What is wrong with computational neuroscience? »

### Brian 2.0 alpha release

We are proud to announce the alpha release of Brian2, the successor of Brian, everyone's favourite neural simulator.

This is an alpha release, therefore many features are still missing and there are very likely many bugs. The main reason for this release is to get feedback from users, the only way to make sure that the final version will be as useful to everyone as possible.

This release is the cumulation of work that started more than one year ago, a basic rewrite of Brian that tries to keep and extend the strengths of Brian (ease of use, flexibility) while building it on a new foundation of a code generation framework that will allow for exciting new applications in the future.

#### How to get Brian 2?

Brian2 is available on the python package index, therefore you can install it using easy\_install or pip:

```
easy_install brian2
pip install --pre brian2
```

Alternatively, you can directly download the package from the package index and install it yourself using python setup.py install (if you are using Python 2, simply running it from the source directory also works).

Finally, you can also clone the git repository at: https://github.com/brian-team/brian2

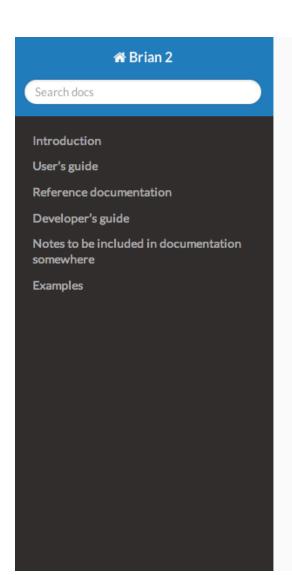
Note that the package is called **brian2**, not **brian**, therefore it does not interfere with an existing Brian installation and trying out Brian2 will not affect your existing Brian simulations.

#### **Documentation**

You can find documentation for Brian2 at readthedocs: http://brian2.readthedocs.org

Note that the user documentation is still quite incomplete, you'll find a lot of information in the reference documentation, though.

## Documentation



Docs » Brian 2 documentation

### **Brian 2 documentation**

#### Contents:

- Introduction
  - Installation
  - o Changes from Brian 1
  - Importing Brian2
- User's guide
  - o Models and neuron groups
  - Equations
  - Refractoriness
  - Synapses
  - Input stimuli
  - Running a simulation
  - Functions
  - Devices
  - Brian 1 Hears bridge
- · Reference documentation
  - BridgeSound class
  - FilterbankGroup class

## **Forums**



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 7
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 8
      P.v = -60*mV
                                                                                                                                                              65
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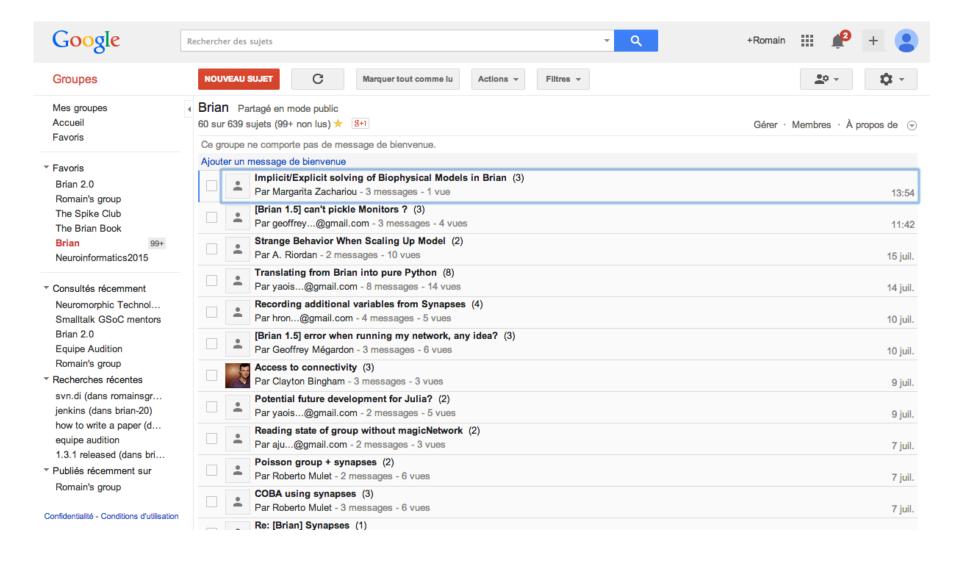
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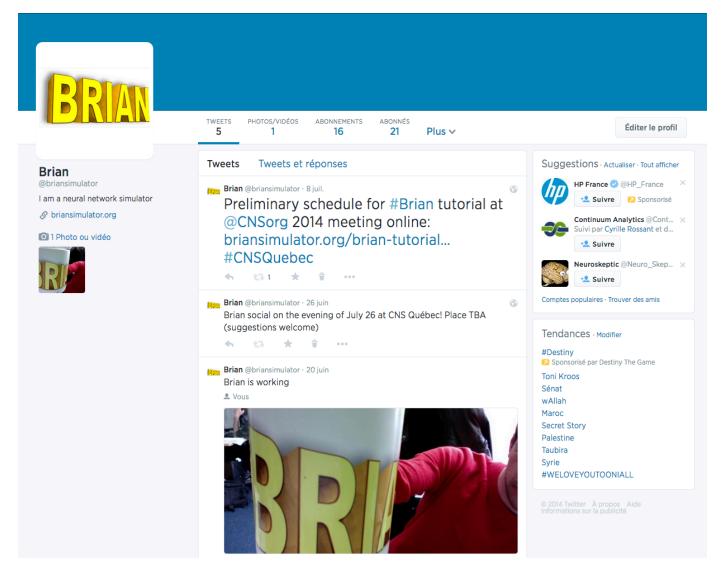
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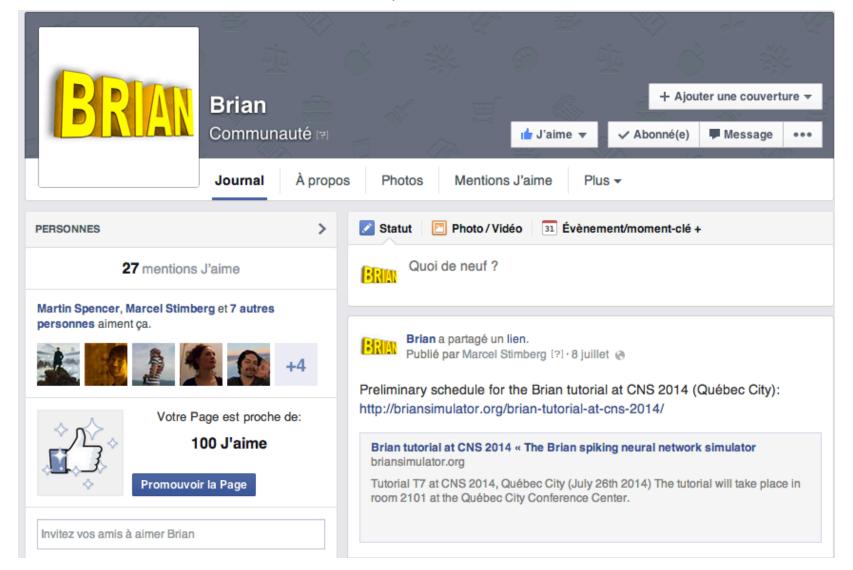
## **Twitter**

### twitter.com/briansimulator



## Facebook

facebook.com/briansimulator





# user groups (BUG)

## Groups for local communities

- = a self-managed subdomain of briansimulator.org(e.g. germany.briansimulator.org)
- + a mailing-list
- post announcements, organize local tutorials
- share code
- support in local language

Interested in creating a BUG? email romain.brette@inserm.fr

Any idea welcome!

# Today

Brian social @ Pub Saint-Patrick (1200 rue Saint-Jean)

Now – 10.10	Core concepts of Brian 2	Marcel Stimberg				
10.10 – 10.40	Coffee break					
10.40 – 12.00	Tutorial	Pierre Yger				
12.00 – 13.30	Lunch					
13.30 – 13.45	Going from Brian 1 to Brian 2	Marcel Stimberg				
13.45 – 14.50	Advanced Brian 2 - Part I	Dan Goodman				
14.50 – 15.20	Coffee break					
15.20 – 16.30	Advanced Brian 2 - Part II	Marcel Stimberg				

19.00 – late