



# Human Brain Project

## 5<sup>th</sup> Annual Human Brain Project Summit

18<sup>th</sup> - 20<sup>th</sup> October 2017  
Scottish Exhibition Centre (SEC), Glasgow



Human Brain Project

5th Annual HBP Summit  
Oct 18 - 20 2017  
SEC, Glasgow, Scotland, UK

Hosted by  
the University  
of Glasgow



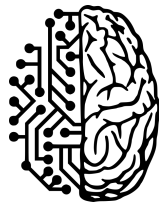
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# Tutorial: BrainScaleS Neuromorphic Hardware

HBP Summit 2017

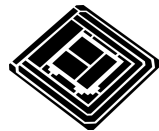


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October 18, 2017

Kirchhoff-Institute for Physics, Heidelberg University

<https://github.com/electronicvisions/SpikeyNUC-workshop>



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# Introduction

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## Wifi:

ESSIDs: DemoBrainScaleS,  
DemoBrainScaleS1, DemoBrainScaleS2  
Password: BrainScaleS

## Jupyter notebook hub:

<http://192.168.0.212>  
(Pick a username, password is BrainScaleS)

## GitHub:

[https://github.com/  
electronicvisions/  
SpikeyNUC-workshop](https://github.com/electronicvisions/SpikeyNUC-workshop)

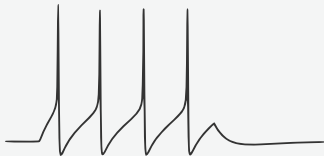
## Spikey school:

<http://192.168.0.212>

# Analog Neuromorphic Hardware

1

observations



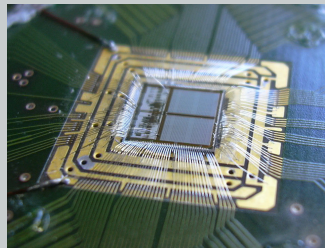
2

mathematical model

$$C \frac{dV}{dt} = -g_L (V - E_L) + I_{\text{syn}}(t)$$

3

hardware realization



# Roadmap

2004

## Spikey

single chip  
system

384 LIF  
neurons

2010

## HICANN

180 nm  
CMOS

512 AdEx  
neurons

2015

## 20 Wafer System

4 million  
neurons

0.9 billion  
synapses

2017

## HICANN DLS

65 nm  
CMOS

32 neurons  
integrated  
CPU for pro-  
grammable  
plasticity

2018

## HICANN DLS-SR

O(512)  
neurons

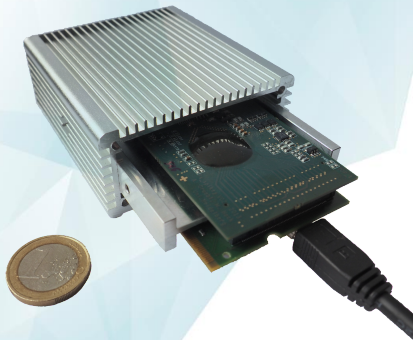
2022

## 500 Wafer System

500 million  
neurons

130 billion  
synapses

# System overview



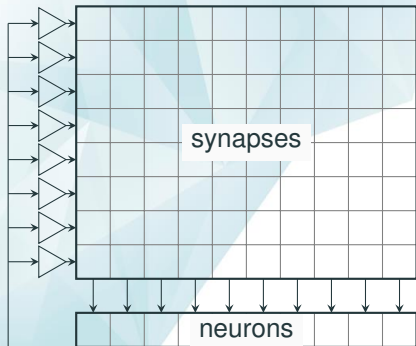
## FPGA:

- Field-programmable gate array
- reconfigurable logic gates
- experiment control and communication

## Spikey:

- 384 neurons,  $384 \times 256$  synapses
- speedup of  $10^4$

# The analog core



## Synapses:

- 4 bit weights (0...15)
- STDP and STP

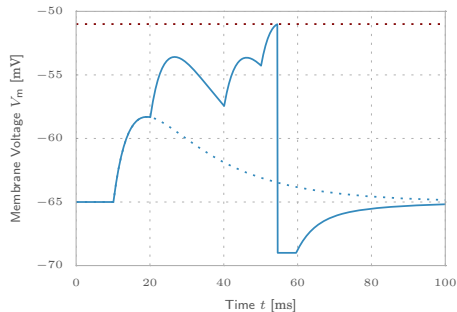
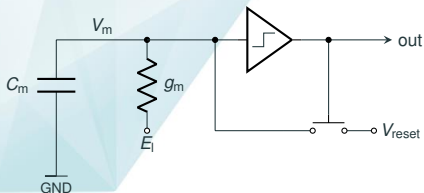
## Neurons:

- Leaky-integrate-and-fire model (LIF)
- analog parameters can be configured freely



# Leaky-integrate-and-fire neurons

$$C_m \frac{dV_m}{dt} = -g_l(V_m - E_l) + I_{\text{syn}} + I_{\text{ext}}$$



# Working with Spikey

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<https://neuralensemble.org/docs/PyNN/0.7/api/api-0.7.html>

## Look out for:

- `pynn.Population`
- `pynn.Projection`
- `pynn.*Connector`



# Creating (groups of) neurons

## Create *populations* of neurons:

```
params = {  
    "v_thresh": -60.0  
}  
neurons = pynn.Population(42, pynn.IF_facets_hardware1, cellparams=params)
```

## Get a list of default neuron parameters:

```
print pynn.IF_facets_hardware1.default_parameters
```



# Generating stimuli

## Create a stimulus from a spike train:

```
spike_train = np.arange(10.0, 101.0, 10.0)
stimulus = pynn.Population(1, pynn.SpikeSourceArray, {"spike_times": spike_train})
```

## There is also a Poisson spike source:

```
poisson_params = {
    "start": 10.0,
    "duration": 100.0,
    "rate": 5.0
}

stimulus = pynn.Population(1, pynn.SpikeSourcePoisson, poisson_params)
```

# Synaptic connections

## Connect all pre-synaptic to all post-synaptic neurons:

```
weight = 15 * pynn.minExcWeight()  
conn = pynn.AllToAllConnector(weights=weight)  
proj = pynn.Projection(pre, post, conn)
```

## Specify connections in a list:

```
conn = pynn.FromListConnector([(7, 13, w, d), (42, 0, w, d)])
```

## Other connectors (look at specification):

FixedNumberPreConnector

FixedNumberPostConnector

FixedProbabilityConnector

# Recording observables

## Spike times:

```
neurons.record()  
...  
spikes = neurons.getSpikes()
```

## Analog membrane traces:

```
pynn.record_v(neurons[0], "")
```

- only *one* analog-to-digital converter (ADC)  
→ one can record a single neuron at a time

# Tasks

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# Task 1: a single neuron



- create a spike source
- create a single LIF neuron
- connect these two populations with maximum weight
- record spikes and the membrane trace of the stimulated neuron

1. vary the synaptic weight and observe the membrane trace
2. play around with the inter-spike interval of the stimulating spike train
3. observe how the PSPs stack up and eventually cause the neuron to fire

## Task 2: passing spikes

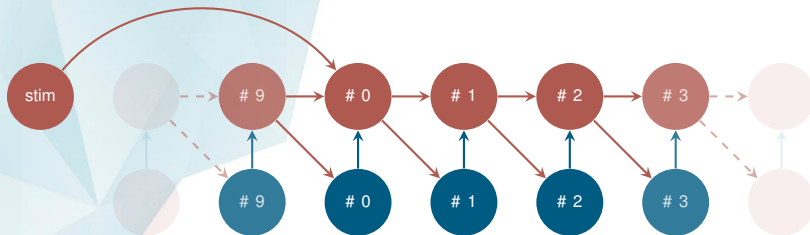


- extend the network by adding another neuron
- record and plot the spikes of both neurons

1. think about different possibilities of creating and connecting the neurons
2. check that the stimulation is passed to the second neuron



## Task 3: a closed synfire chain



- create ten excitatory and ten inhibitory **populations** of neurons and connect them as depicted
- create a transient stimulus to the zeroth excitatory population
- record and plot the spikes of the neurons
- record the membrane potential of a neuron of your choice

## Task 3: a closed synfire chain

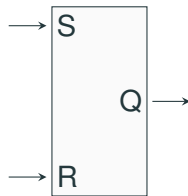
1. evaluate the stability of the chain by tweaking the weight parameters
2. what happens if you disconnect the inhibitory neurons?
3. modify the chain length



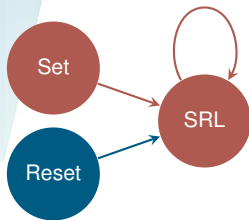
## Task 4: a neural SR latch

Think about how to create a simple SR latch (set/reset latch).

S	R	Q
0	0	no change
0	1	Q = 0, reset state
1	0	Q = 1, set state
1	1	undefined



## Task 4: a neural SR latch



- create a population of latch neurons and project them onto themselves
- create a transient excitatory and a transient inhibitory stimulus to the latch neurons
- set the stimuli such that the latch is switched on and off consecutively
- record and plot the spikes of the neurons
- record the membrane potential of a latch neuron