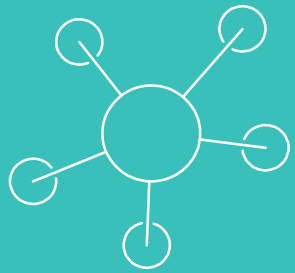


# COMPUTATIONAL INTELLIGENCE

## - labs & project



# Labs

Iris, MLP, SOM, AGDS..

## ● Summary no.1

### ○ Personal neural net:

- Written in Python3
- Follows OO concept
- Loads data from csv
- Exports net to yaml and cypher
- Pluginable bias nodes
- Any activation function

## The right way to do that

```
1  !!python/object:core.network.Network
2  constants:
3    activation: sigmoid
4    beta: 0.7
5    learning_factor: 0.3
6    normalised: true
7    weight_from: -2
8    weight_to: 2
9  layers:
10 - !!python/object:core.layer.InputLayer
11   network_name: xor
12   neurons:
13   - &id005 !!python/object:core.neuron.InputNeuron
14     delta: -0.06134907502497106
15     deltas: !!set {}
16     inputs: null
17     learning_factor: 0.3
18     name: input1
19     network_name: xor
20     outputs:
21     - &id001 !!python/object:core.neuron.Connection
22       another: &id002 !!python/object:core.neuron.Neuron
23       delta: 0.19809358937246652
24       deltas: !!set {}
25       inputs:
26       - *id001
27       - &id003 !!python/object:core.neuron.Connection
28         another: *id002
29         one: &id014 !!python/object:core.neuron.InputNeuron
```

**Protip #0**

**Use YAML, its awesome**



1

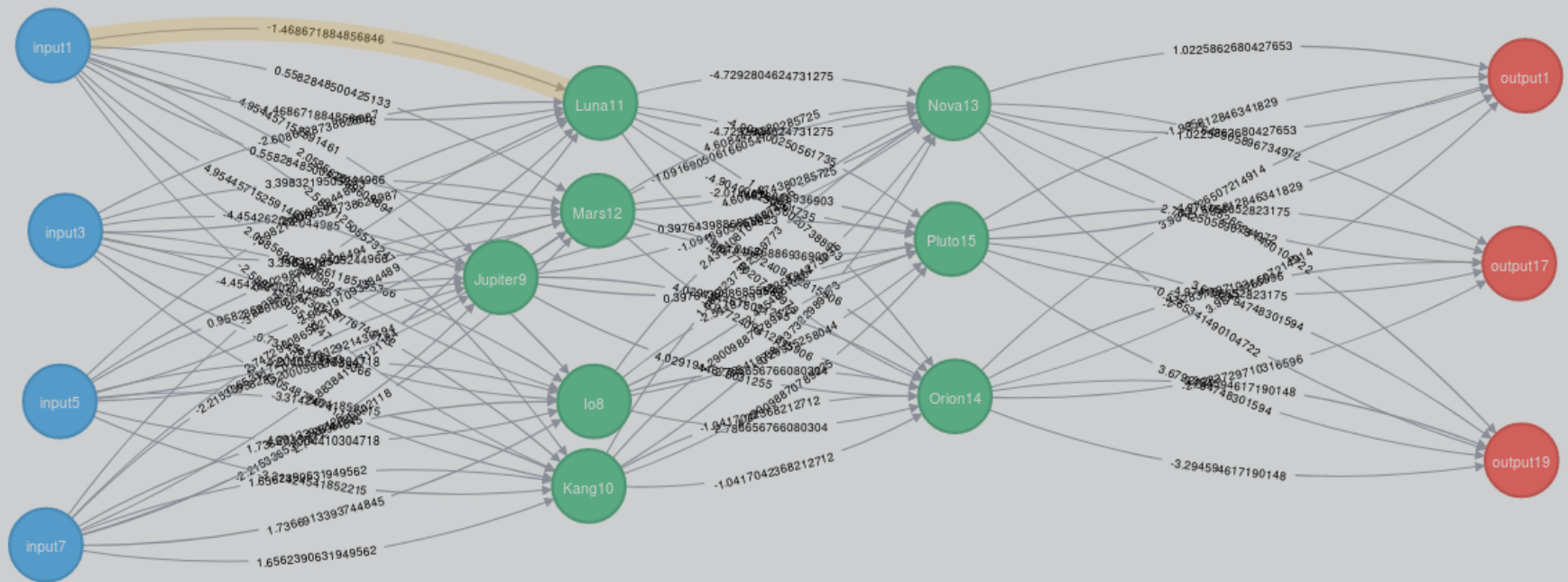
## Basic iris

We all love iris dataset



## Iris dataset

1000 iterations in 4 folds



## Iris dataset

1000 iterations in 4 folds

folds results: [99.6, 99.96842105263158, 94.68947368421053, 91.93611111111111]

In0	In1	In2	In3	Iris-virginica	Iris-versicolor	Iris-setosa
6.900	3.100	5.100	2.300	1.000	0.001	0.000
5	2	3.500	1	0.000	0.966	0.007
5.400	3.700	1.500	0.200	0.000	0.008	0.994

Took about 40s

Learning rate: 0.3

Beta: 0.7

Random weights: from -2 to 2

Activation function: sigmoid



## Iris dataset

1000 iterations in 4 folds

folds results: [99.6, 99.96842105263158, 94.68947368421053, 91.93611111111111]

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Took about 40s

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Beta: 0.7

Random weights: from -2 to 2

Activation function: sigmoid

For Tensor Flow it was 0.3s..



**Notice #1**

**Python is slow.**

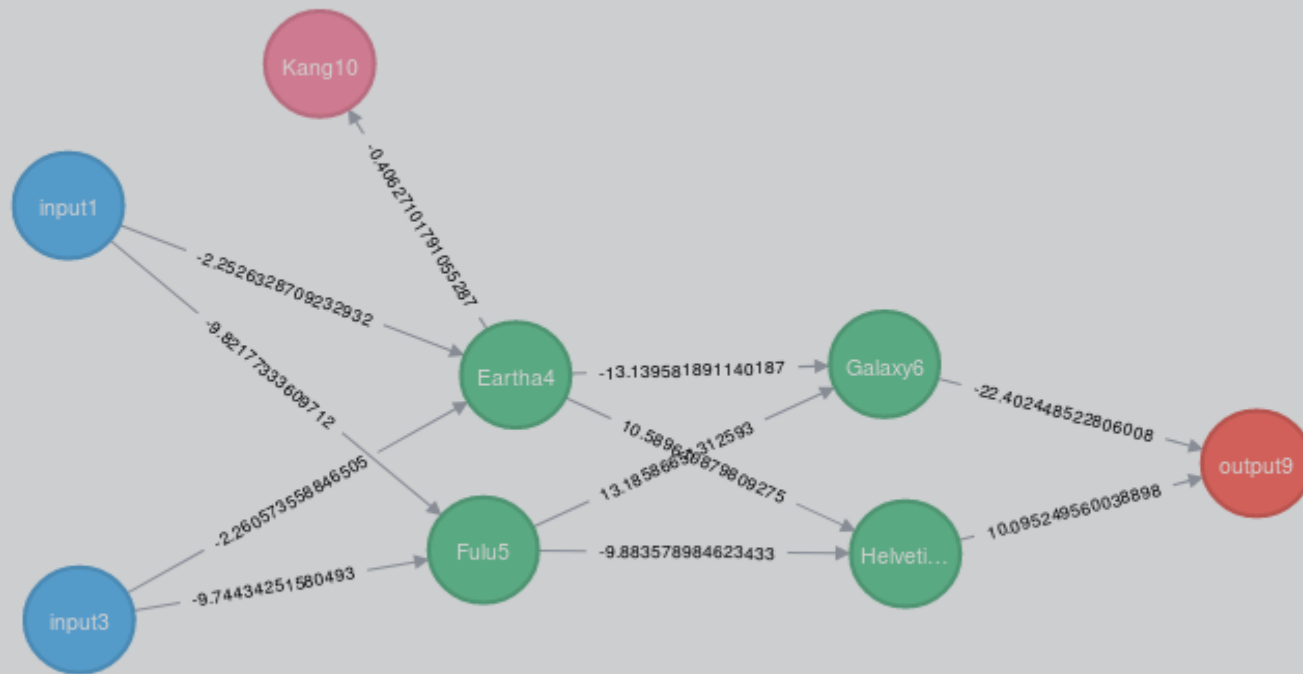
or I can't write fast code



xor

xor?

## Another dataset



## Another dataset

----- test -----

+-----+-----+-----+

In0	In1	Out0
-----	-----	------

+-----+-----+-----+

0	0	0.022
---	---	-------

+-----+-----+-----+

0	1	0.934
---	---	-------

+-----+-----+-----+

1	1	0.081
---	---	-------

+-----+-----+-----+

1	0	0.937
---	---	-------

+-----+-----+-----+

Learning rate: 0.1

Beta: 0.98

Weights: from -5 do 5

10k iterations

Took about 2s

Random bias added

Activation: ReLu

**Pro tip #2**


○ **Try different activation function!**



1

# Deep MLP

Multi layer perceptron



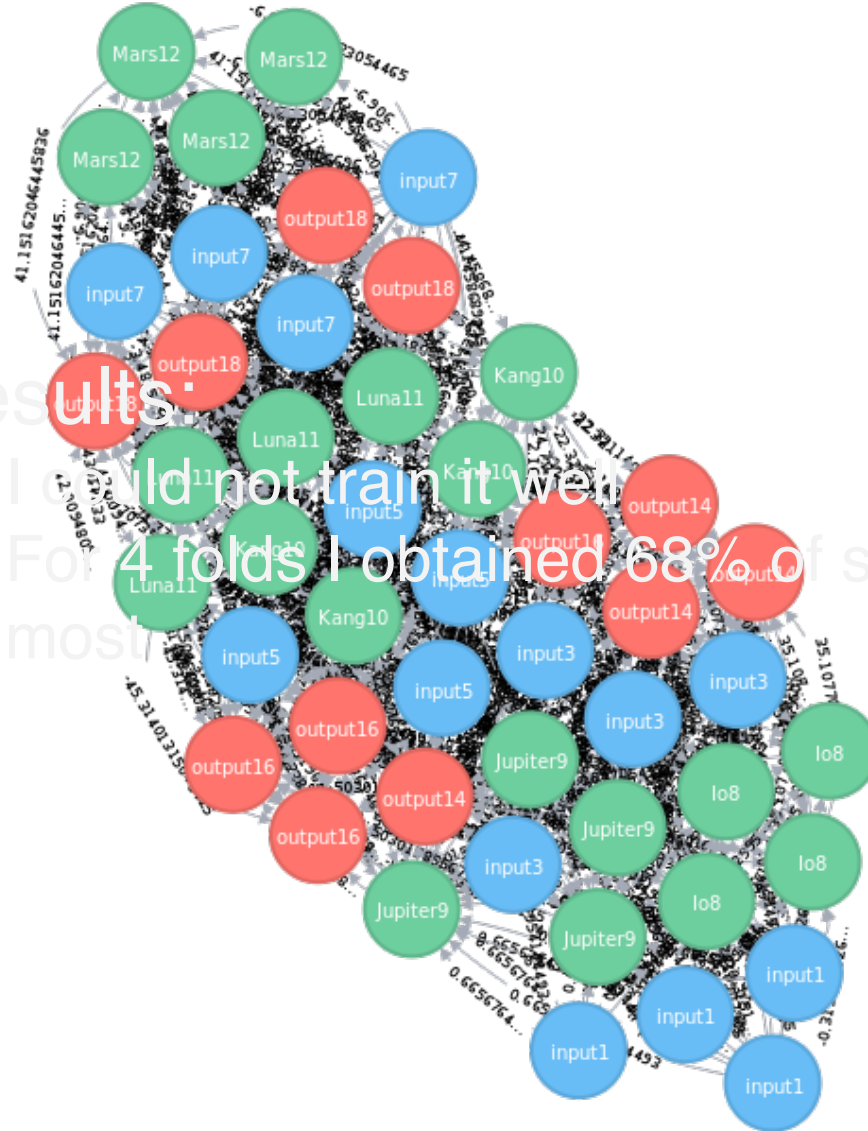
How it looks like?

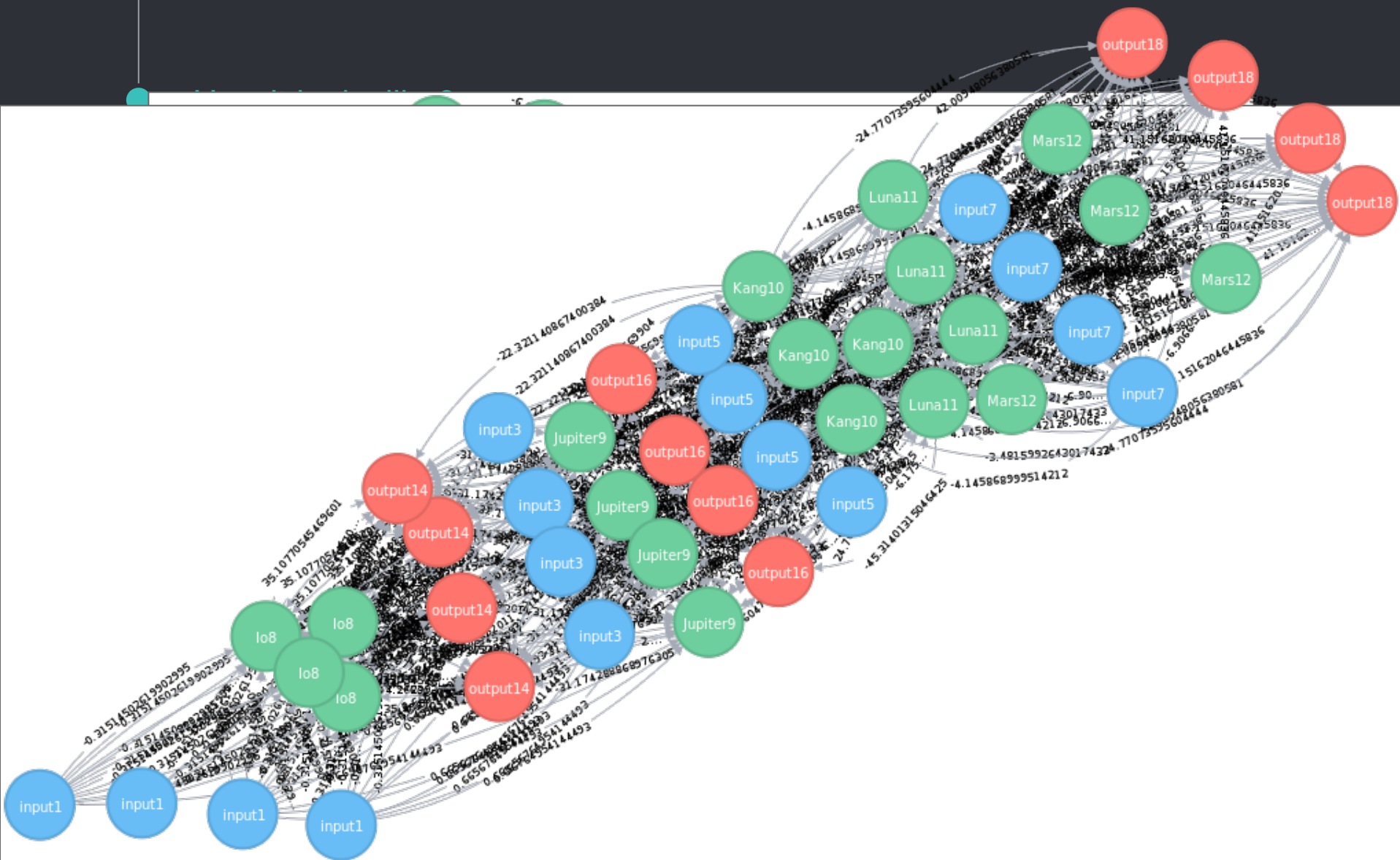
- Results:
  - I could not train it well
  - For 4 folds I obtained 68% of success at most



- Results:

- I could not train it well
- For 4 folds I obtained 68% of success at most







2

Som

Self organizing maps



Som

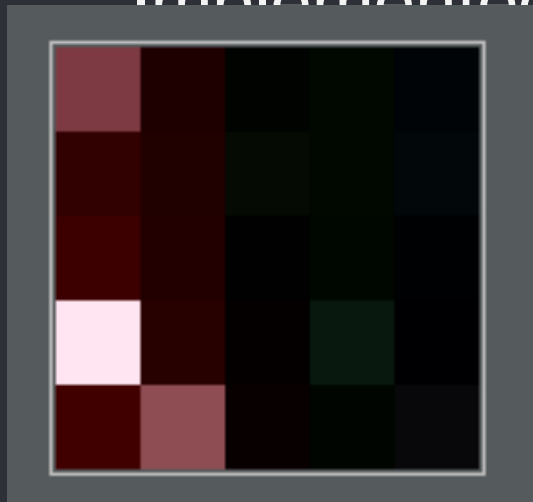
Implemented with 5x5 matrix (numpy),

Trained unsupervised

Plugged as second input to mlp

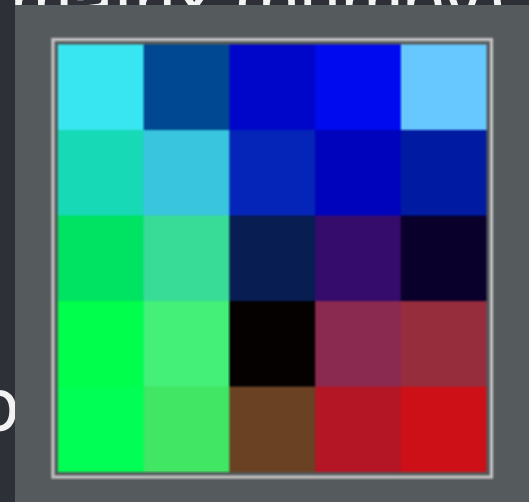
Som

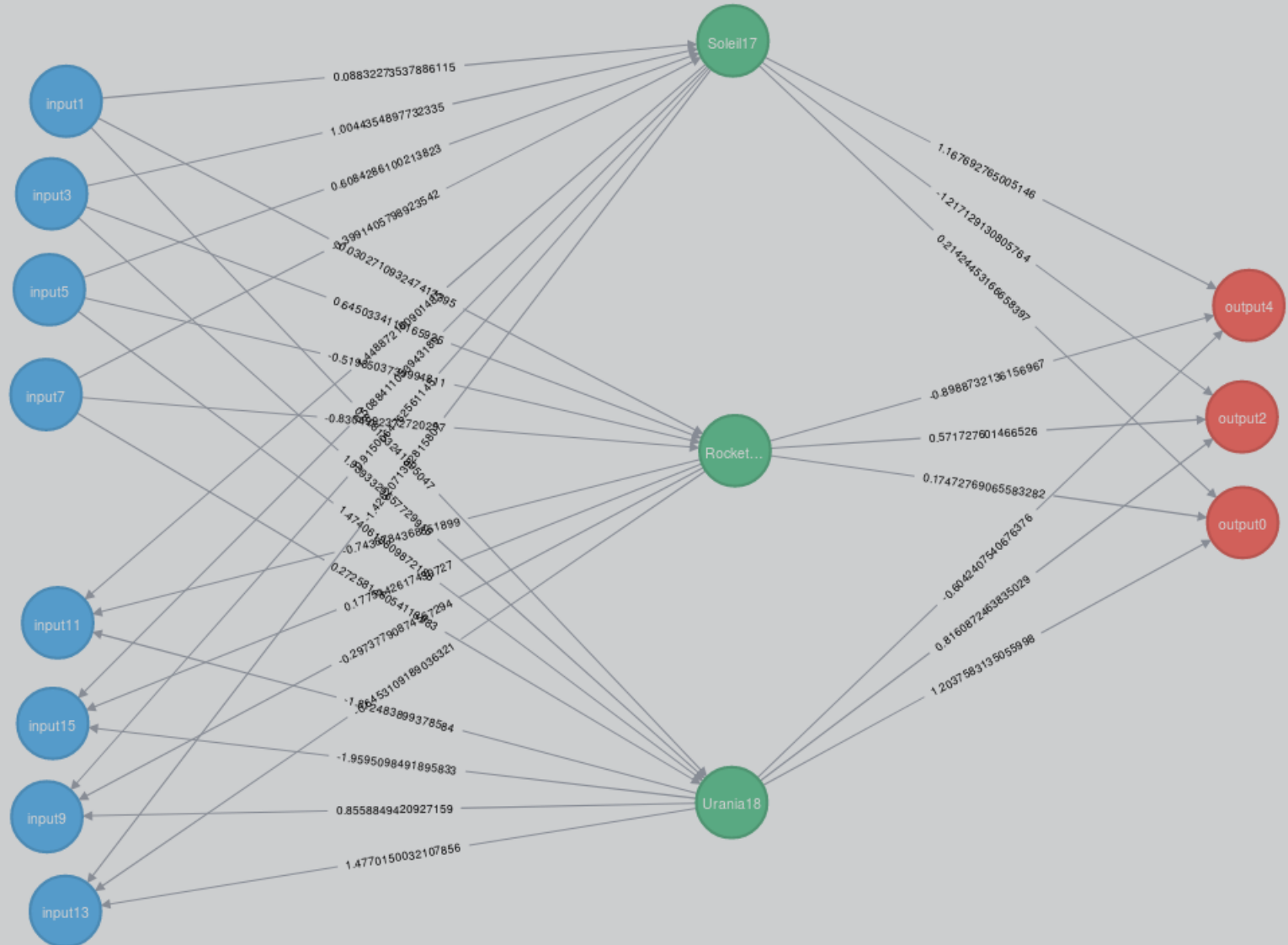
Implemented with 5x5 matrix (numpy)



Supervised

second inp







## Gains:

- 95.75 % without SOM
- 96.50 % with SOM



3

AGDS



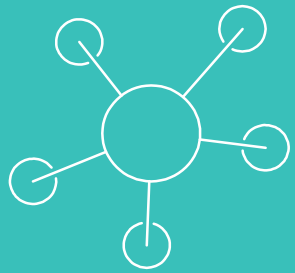
## Similarity percentage:

```
[((id: 140403750792328, class: Iris-versicolor, 4.0-1.2-5.8-2.6), 100.0)
((id: 140403750816568, class: Iris-virginica, 5.6-1.4-6.1-2.6), 81.24),
((id: 140403750808208, class: Iris-virginica, 5.0-1.5-6.0-2.2), 79.67),
((id: 140403750818872, class: Iris-virginica, 5.1-1.9-5.8-2.7), 79.6),
((id: 140403750799008, class: Iris-virginica, 5.1-1.9-5.8-2.7), 79.6),
((id: 140403750816288, class: Iris-virginica, 5.1-1.5-6.3-2.8), 79.33),
((id: 140403750789528, class: Iris-versicolor, 3.9-1.2-5.8-2.7), 78.83),
((id: 140403750806528, class: Iris-virginica, 5.0-2.0-5.7-2.5), 78.55),
((id: 140403750814328, class: Iris-virginica, 4.8-1.8-6.2-2.8), 78.4),
((id: 140403750809328, class: Iris-virginica, 4.9-1.8-6.3-2.7), 78.34),
((id: 140403750800408, class: Iris-virginica, 4.5-1.7-4.9-2.5), 78.31),
((id: 140403750817688, class: Iris-virginica, 4.8-1.8-6.0-3.0), 77.84),
((id: 140403750808768, class: Iris-virginica, 4.9-2.0-5.6-2.8), 77.5),
((id: 140403750820832, class: Iris-virginica, 5.1-1.8-5.9-3.0), 77.38),
((id: 140403750819992, class: Iris-virginica, 5.0-1.9-6.3-2.5), 77.17),
((id: 140403750785264, class: Iris-versicolor, 4.1-1.0-5.8-2.7), 77.16),
((id: 140403750791768, class: Iris-versicolor, 4.4-1.2-5.5-2.6), 76.98),
((id: 140403750814608, class: Iris-virginica, 4.9-1.8-6.1-3.0), 76.95),
((id: 140403750785824, class: Iris-versicolor, 3.9-1.1-5.6-2.5), 76.88),
```

...

**Notice #3**

**Precalculated AGDS is blazing-fast**



# Final project

Artificial player (neural net) for Snake

1

## Design Features

Which parameters could be useful?

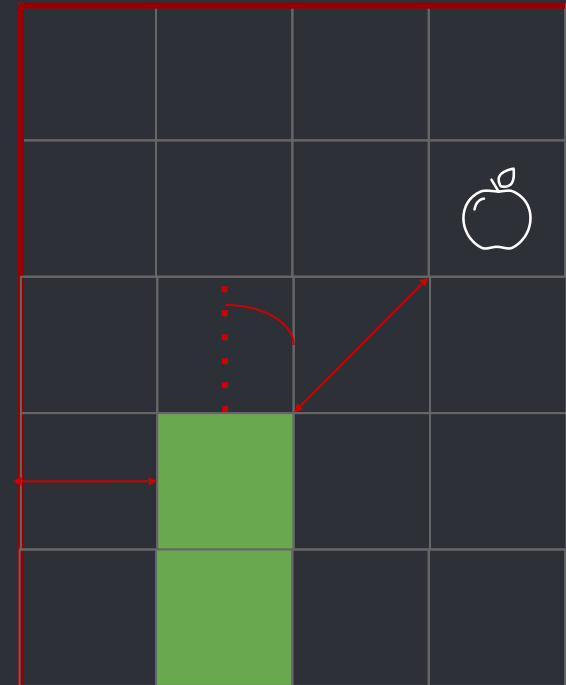
## Features

Obstacles?

- In front
- Left side
- Right side

Distance to apple?

Angle to apple?





2

## Gather data

Lots of it

● How to gather data?

## ○ **Generate your own**

Since snake is fairly simple, we can generate random moves and evaluate them

## **Get some friends**

Track moves from real games

- Learning data gathering

**<https://storage.googleapis.com/snek-front/main.html>**



Snek Snek

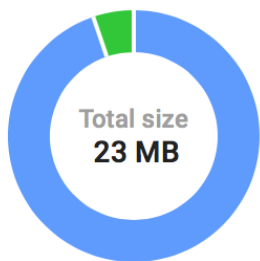


Kind

senk

## Summary

Last updated 15 hours ago — June 18, 2018 at 9:43:41 AM UTC+2 ?



Resource	Count ?	Size
Entities	118	21.82 MB
Built-in indexes ?	14,808	1.2 MB
Composite indexes ?	0	0 B

Kind "senk" is 100% of total Datastore storage  
23.02 MB / 23.02 MB

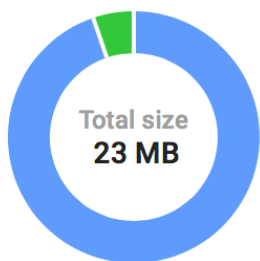
Score: 5

Kind

senk

## Summary

Last updated 15 hours ago — June 18, 2018 at 9:43:41 AM UTC+2 ?



Resource

Entities

Built-in indexes ?

Composite indexes

Kind "senk" is 100% of total Datastore storage  
23.02 MB / 23.02 MB

Score: 5



## Entity details



Key: senk id:4795020674596864 Key literal: Key(senk, 4795020674596864) URL-safe key: ahpnmf15LXByb2pLY3QtMTQ3NzczMDQ2MDYwMHIRCxIEc2Vuax

### Properties

date

1525194393519

game

```
{{"score":0,"new_dir":"down","snek":[{"y":0,"x":4}, {"y":1,"x":4}, {"y":2,"x":4}, {"y":2,"x":5}, {"y":2,"x":6}, {"y":2,"x":7}, {"y":2,"x":8}, {"y":2,"x":9}, {"y":2,"x":10}, {"y":2,"x":11}], "old_dir":"right", "food":{"x":13,"y":5}}, {"new_dir":"right", "snek":[{"x":4,"y":0}, {"x":4,"y":1}, {"y":2,"x":4}, {"y":2,"x":5}, {"x":6,"y":2}, {"y":2,"x":7}, {"y":2,"x":8}, {"y":2,"x":9}, {"y":2,"x":10}, {"y":2,"x":11}], "old_dir":"down", "food" ... }
```

**Pro tip #4**

**Gather more, filter later**



2

## Learning time

This thing is so lazy..

- Baby steps

```
Score : 0 SNAKE
#
## *
```

```
{'r': 0, 'f': 0, 'a': -1, 'l': 1}
```

```
Score : 0 SNAKE
###
*
1
```

```
{'l': 0, 'f': 0, 'a': 0, 'r': 1}
```

- Baby steps

```
Score : 0 SNAKE
#
## *
```

```
{'r': 0, 'f': 0, 'a': -1, 'l': 1}
```

```
Score : 0 SNAKE
###
*
1
```

```
{'l': 0, 'f': 0, 'a': 0, 'r': 1}
```



3

We can do better

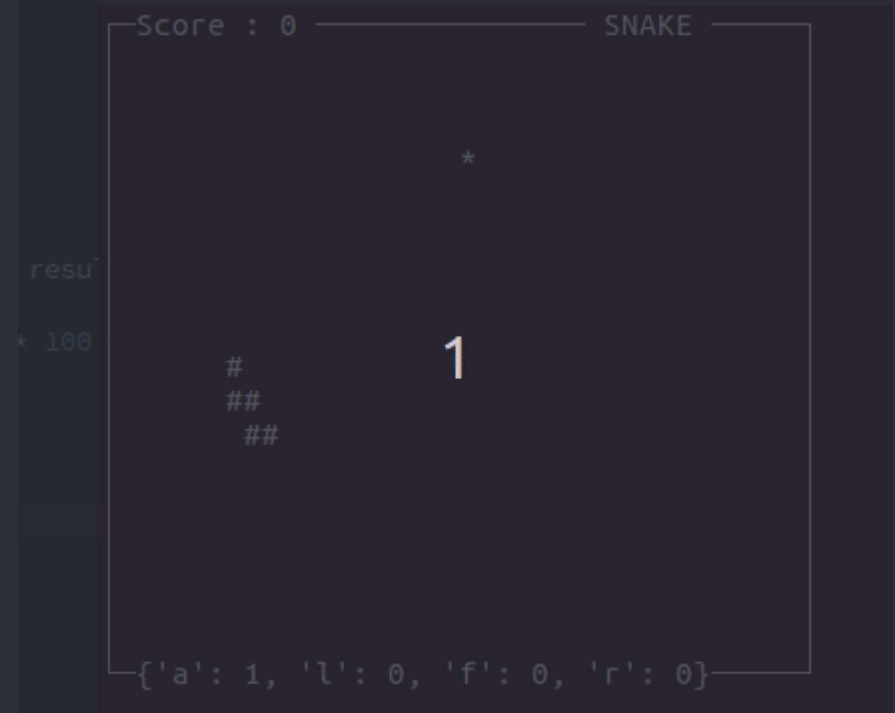
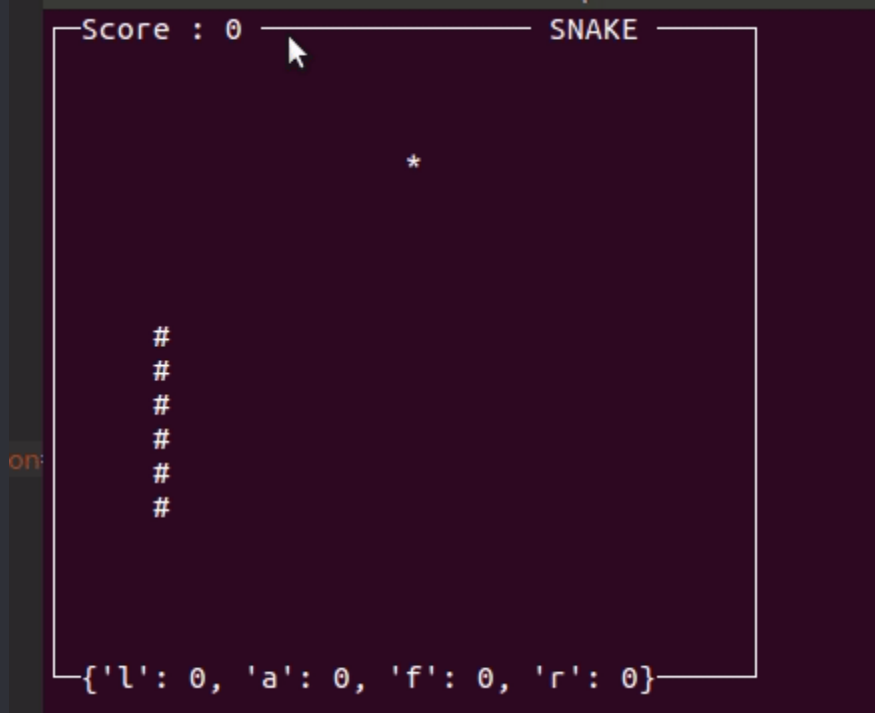
Uh oh.



● After tinkering for a while

○ Things done to improve:

- Change number of layers/neurons/connections
- Add some bias
- Change activation function to ReLu
- Tinker around parameters (learning rate and so on..)



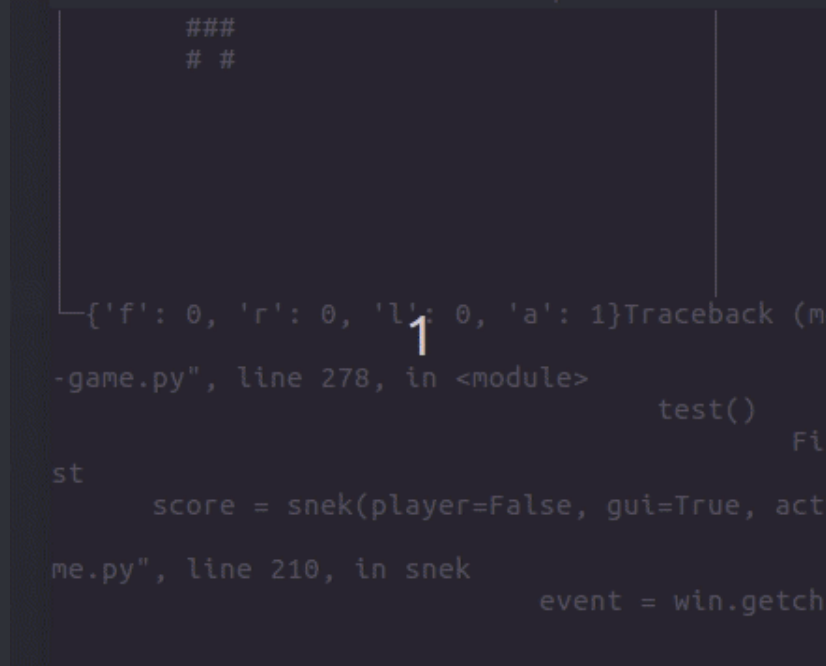
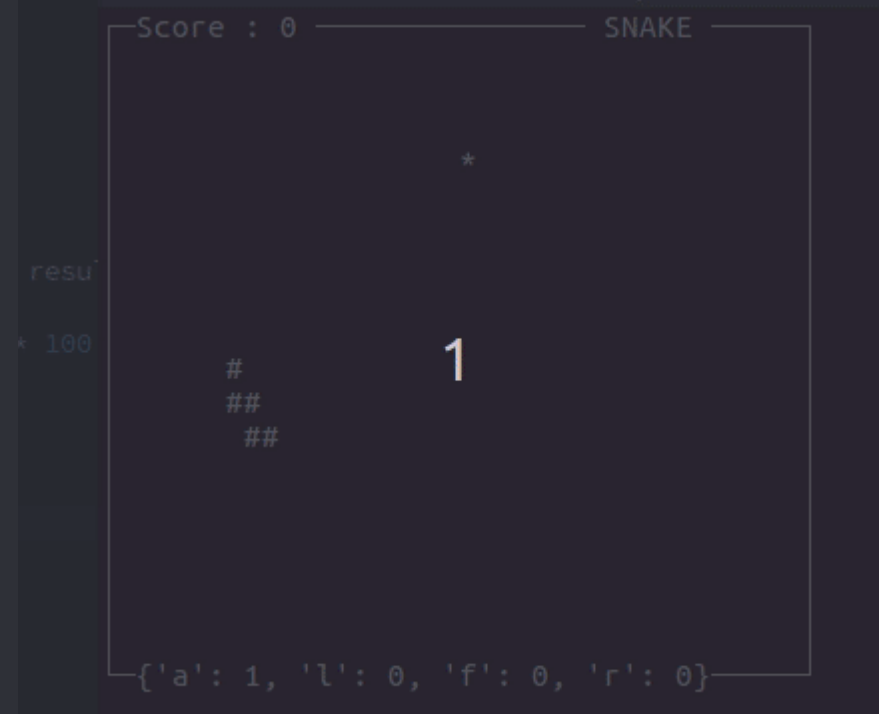
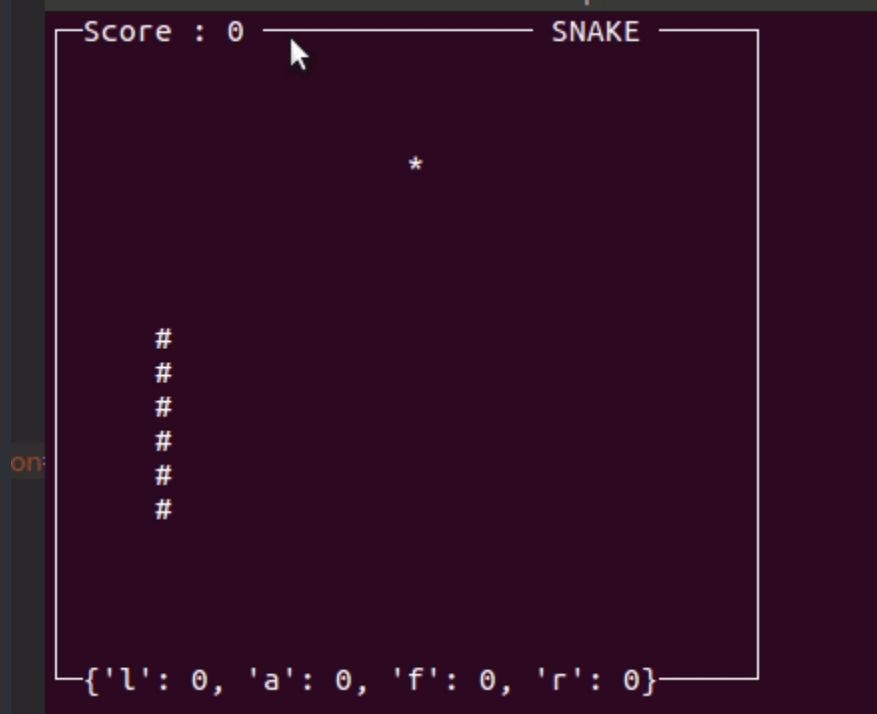
```

#####
# #

[{'f': 0, 'r': 0, 'l': 0, 'a': 1}]
Traceback (most recent call last):
  File "snake-game.py", line 278, in <module>
    test()
  File "snake-game.py", line 210, in snek
    score = snek(player=False, gui=True, act=
  File "snake-game.py", line 210, in snek
    event = win.getch

```

meh.



meh.

● And then something clicked

```
232 if violated_boundary_conditions(snake):
233     result = -1
234 elif not violated_boundary_conditions(snake) and (new_dist < prev_dist) or score > prev_score:
235     result = 1
236 else:
237     result = 0
```

```
232 if violated_boundary_conditions(snake):
233     result = -1
234 elif violated_boundary_conditions(snake) and (new_dist < prev_dist or score > prev_score):
235     result = 0.5
236 elif not violated_boundary_conditions(snake) and (new_dist < prev_dist) or score > prev_score:
237     result = 1
238 else:
239     result = -0.5
```

- Its first points gathered

```
Score : 0 SNAKE
*
##
###
* 100
{'l': 0, 'r': 0, 'f': 0, 'a': 0}
```

- Its first points gathered

```
Score : 0 SNAKE
*
##
###
* 100
{'l': 0, 'r': 0, 'f': 0, 'a': 0}
```



**Pro tip #5**

**Be patient**

● Obtained results:

○ With:

- Over 100 real games
- About 2000 data points extracted
- Over 10k points generated

After:

- 20 minutes of learning

Got:

- ~ 86% from 4 folds



## Summary

```
= Average steps: 188.566
Counter({112: 11, 75: 10, 76: 10, 82: 10, 97: 1
0: 7, 124: 7, 149: 7, 159: 7, 182: 7, 60: 6, 64
: 5, 96: 5, 99: 5, 100: 5, 103: 5, 119: 5, 135:
5, 44: 4, 50: 4, 52: 4, 53: 4, 54: 4, 55: 4, 58
: 4, 141: 4, 146: 4, 150: 4, 162: 4, 165: 4, 17
3, 56: 3, 71: 3, 80: 3, 90: 3, 91: 3, 94: 3, 95
3, 143: 3, 153: 3, 156: 3, 158: 3, 163: 3, 167
3, 285: 3, 299: 3, 305: 3, 318: 3, 325: 3, 327
2, 104: 2, 107: 2, 118: 2, 122: 2, 125: 2, 152
2, 194: 2, 195: 2, 197: 2, 198: 2, 202: 2, 206
2, 251: 2, 253: 2, 261: 2, 266: 2, 268: 2, 277
2, 329: 2, 333: 2, 335: 2, 343: 2, 352: 2, 355
2, 443: 2, 450: 2, 502: 2, 526: 2, 532: 2, 587
, 129: 1, 140: 1, 166: 1, 181: 1, 200: 1, 207:
, 248: 1, 250: 1, 252: 1, 254: 1, 256: 1, 257:
, 297: 1, 298: 1, 300: 1, 302: 1, 303: 1, 308:
, 357: 1, 362: 1, 363: 1, 367: 1, 369: 1, 372:
, 417: 1, 418: 1, 419: 1, 425: 1, 428: 1, 429:
, 487: 1, 490: 1, 494: 1, 517: 1, 548: 1, 553:
, 647: 1, 682: 1, 793: 1, 809: 1, 917: 1})
Average score: 9.386
Counter({3: 123, 4: 106, 6: 88, 5: 85, 7: 81, 8
```

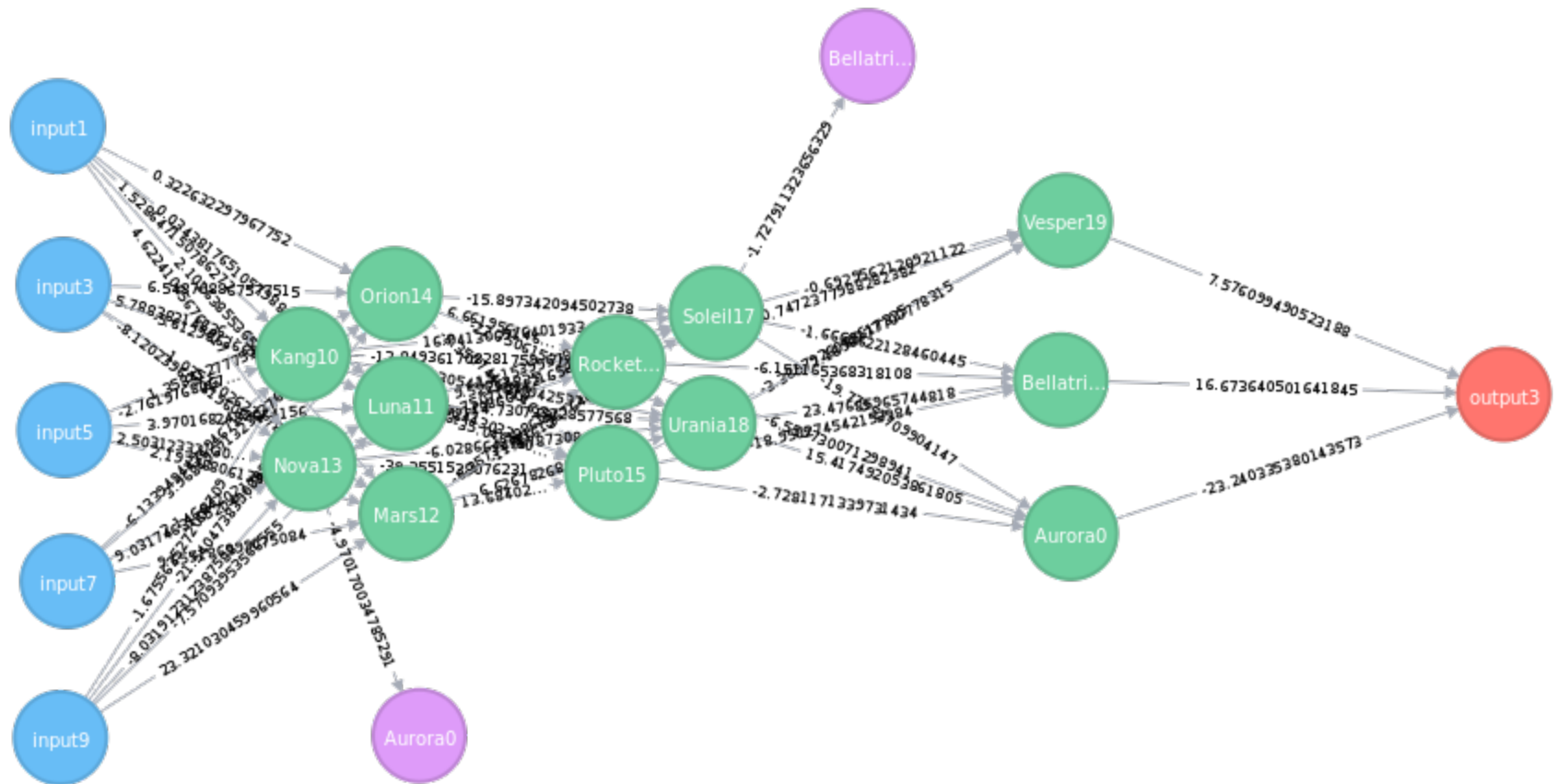
1 network  
5 layers  
18 neurons

## Summary

```
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Counter({112: 11, 75: 10, 76: 10, 82: 10, 97: 1
0: 7, 124: 7, 149: 7, 159: 7, 182: 7, 60: 6, 64
: 5, 96: 5, 99: 5, 100: 5, 103: 5, 119: 5, 135:
5, 44: 4, 50: 4, 52: 4, 53: 4, 54: 4, 55: 4, 58
: 4, 141: 4, 146: 4, 150: 4, 162: 4, 165: 4, 17
3, 56: 3, 71: 3, 80: 3, 90: 3, 91: 3, 94: 3, 95
3, 143: 3, 153: 3, 156: 3, 158: 3, 163: 3, 167
3, 285: 3, 299: 3, 305: 3, 318: 3, 325: 3, 327
2, 104: 2, 107: 2, 118: 2, 122: 2, 125: 2, 152
2, 194: 2, 195: 2, 197: 2, 198: 2, 202: 2, 206
2, 251: 2, 253: 2, 261: 2, 266: 2, 268: 2, 277
2, 329: 2, 333: 2, 335: 2, 343: 2, 352: 2, 355
2, 443: 2, 450: 2, 502: 2, 526: 2, 532: 2, 587
, 129: 1, 140: 1, 166: 1, 181: 1, 200: 1, 207:
, 248: 1, 250: 1, 252: 1, 254: 1, 256: 1, 257:
, 297: 1, 298: 1, 300: 1, 302: 1, 303: 1, 308:
, 357: 1, 362: 1, 363: 1, 367: 1, 369: 1, 372:
, 417: 1, 418: 1, 419: 1, 425: 1, 428: 1, 429:
, 487: 1, 490: 1, 494: 1, 517: 1, 548: 1, 553:
, 647: 1, 682: 1, 793: 1, 809: 1, 917: 1})
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```

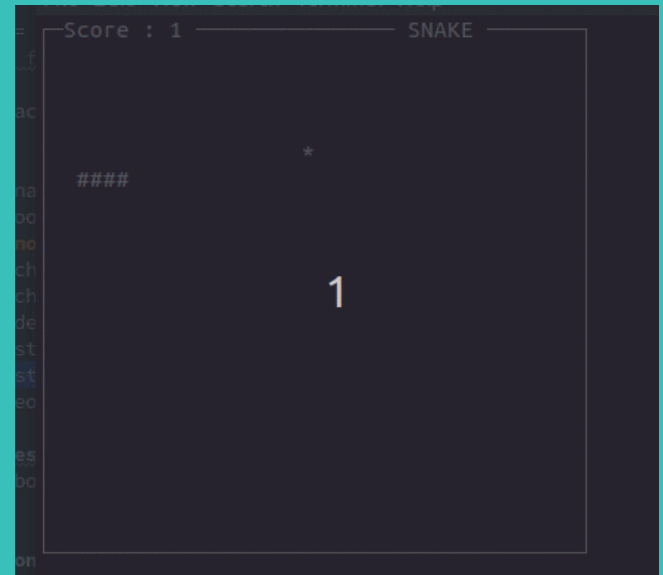
1 network  
5 layers  
18 neurons

## Summary



Thanks!

ANY QUESTIONS?



Thanks!

ANY QUESTIONS?

