

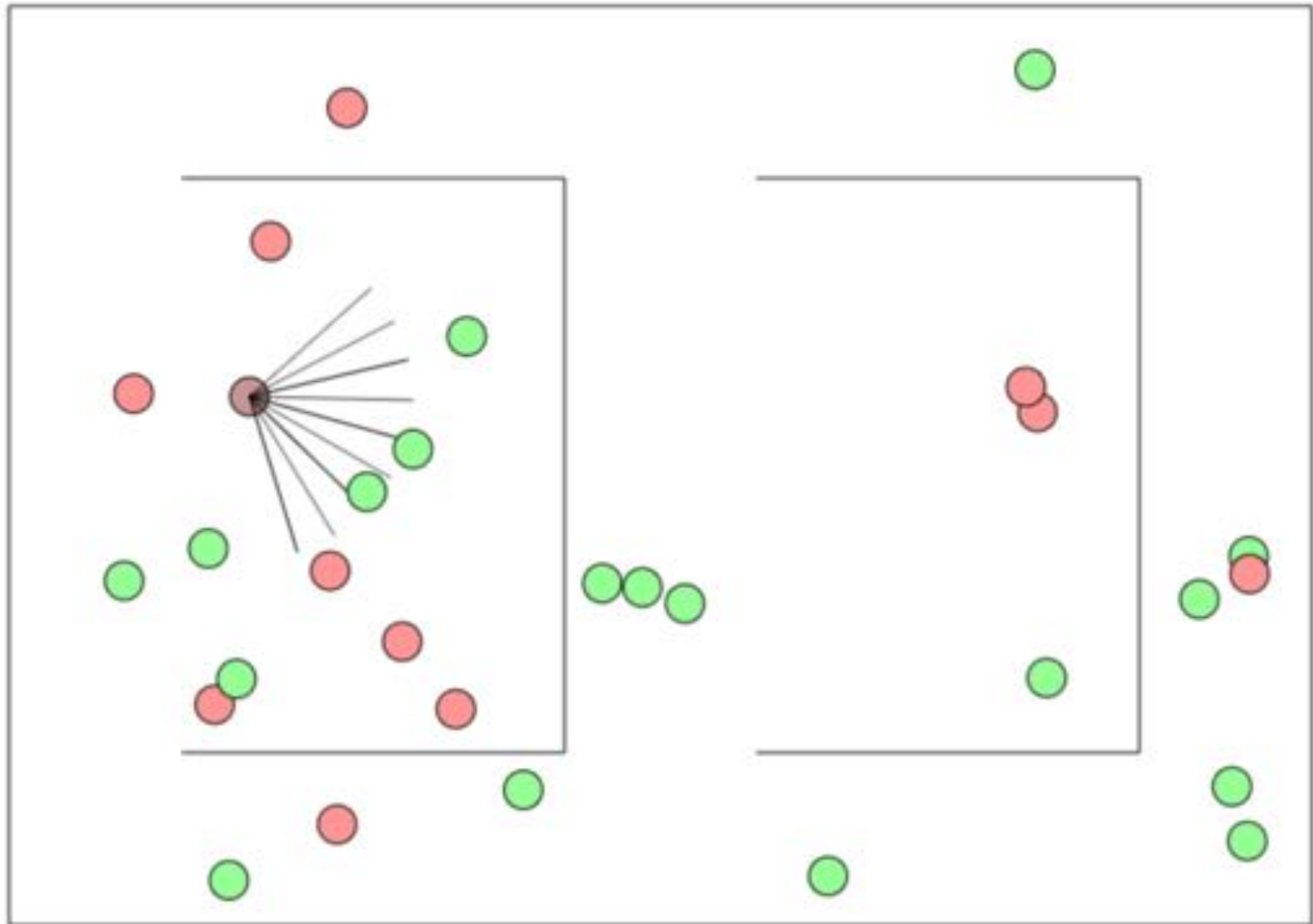


Artificial Intelligence

Chris Piech
CSBridge 2019



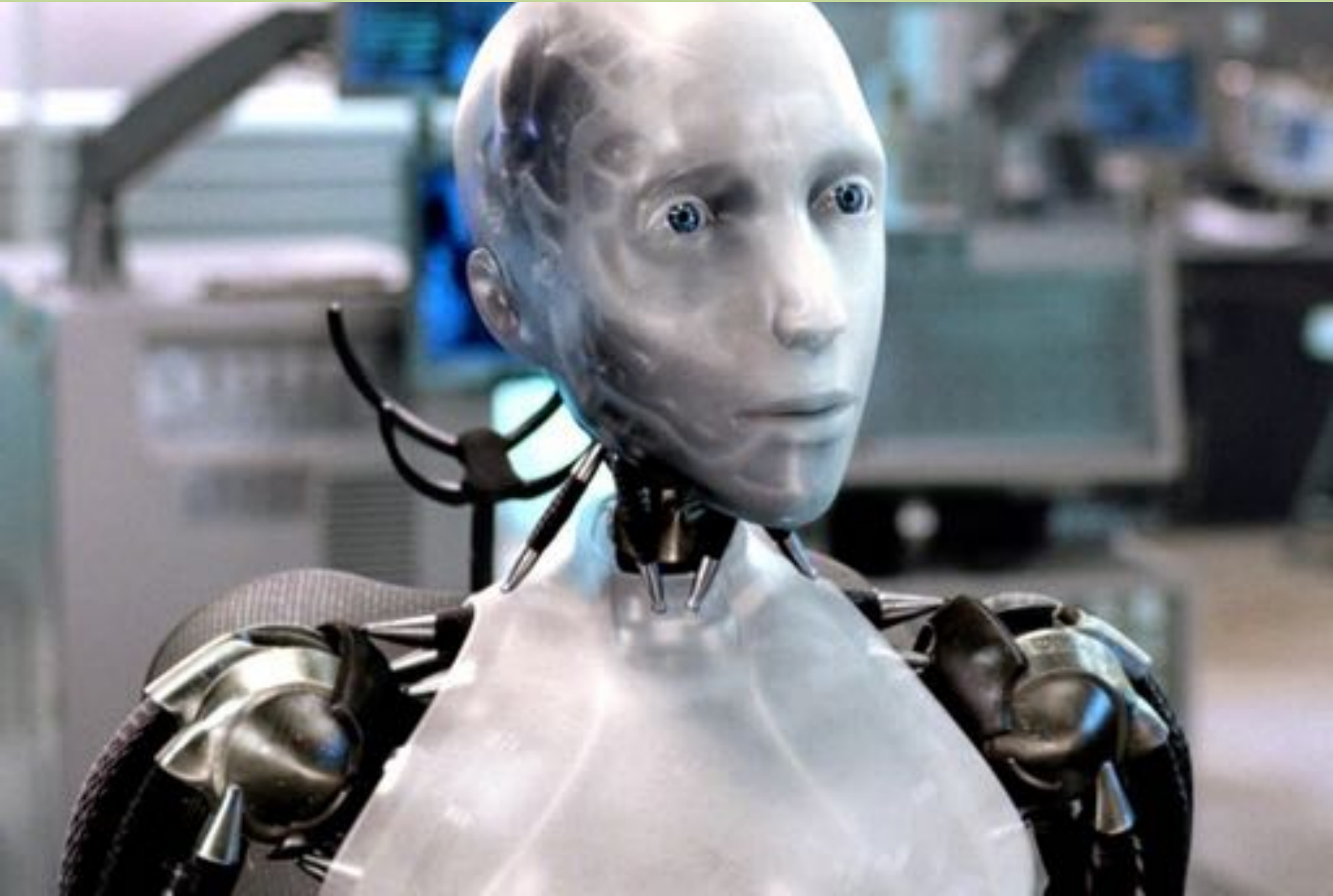
A Little AI



Something big is happening
in the world of AI...

Where is my robot?

Sci-Fi Has Promised Me Robots



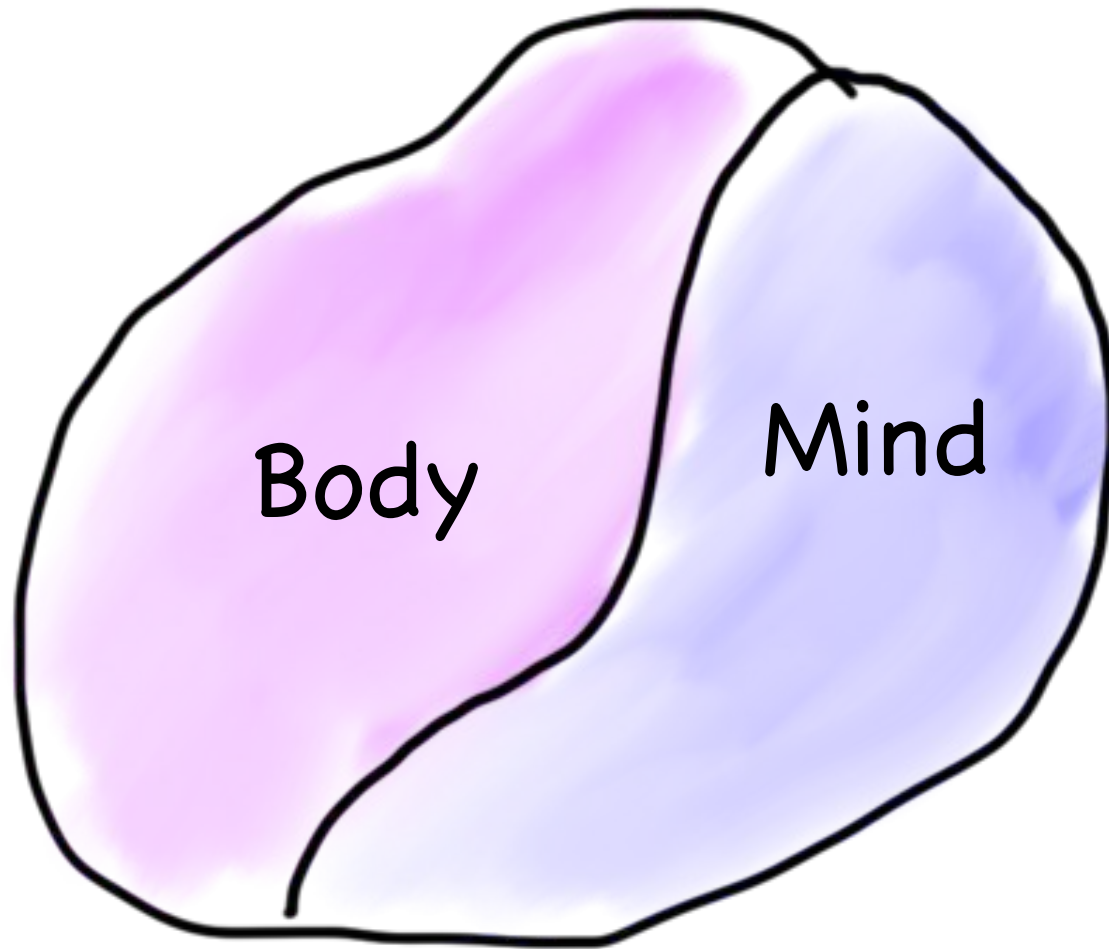
House Cleaning Robot



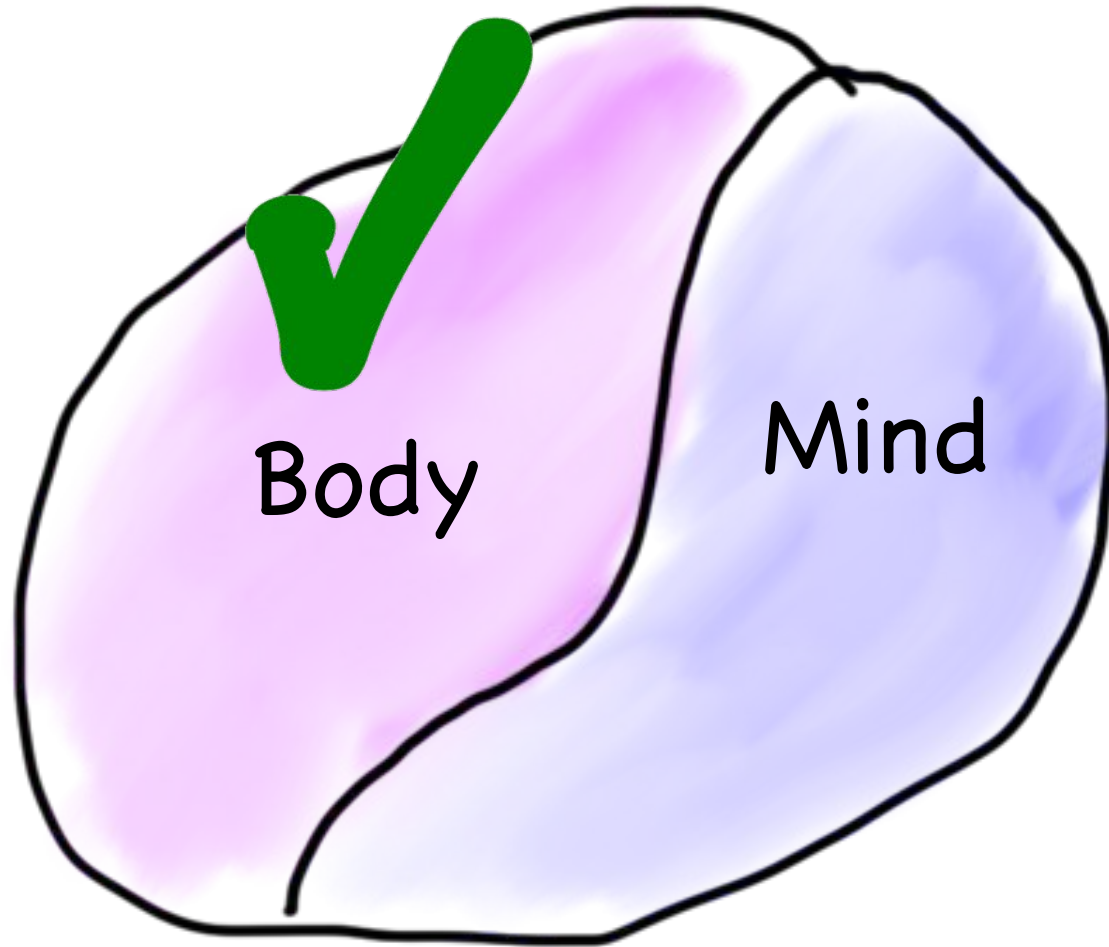
House Cleaning Robot



Robots?



Robots?



What is AI?

[suspense]

AI: The study and design of intelligent **agents**



Computer programs



AI: The study and design of intelligent **agents**

Better than chance



As well as humans



Narrow Intelligence

Play Chess

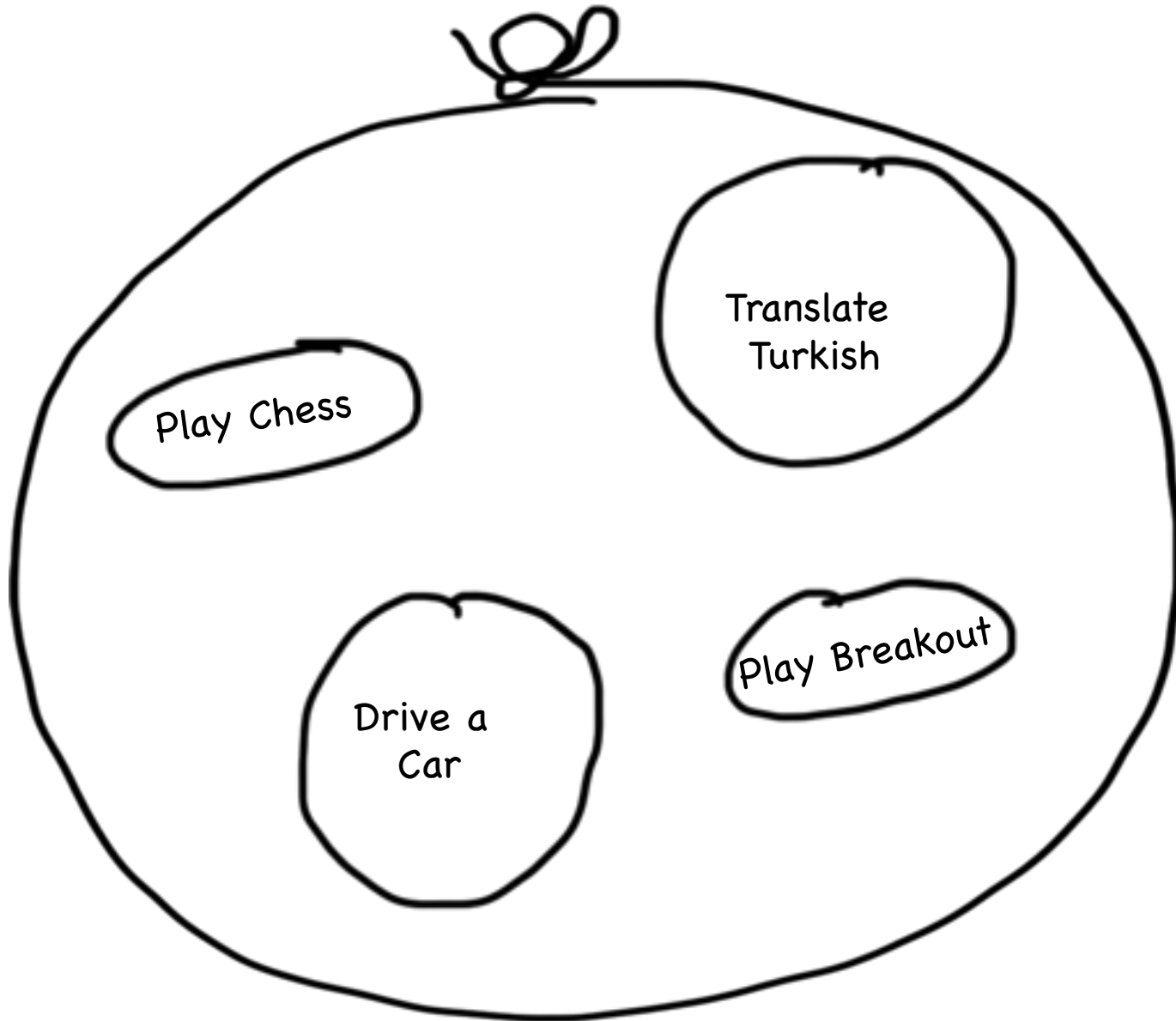
Translate
Turkish

Drive a
Car

Play Breakout



General Intelligence



Brief History



Early Optimism 1950s



1952



Early Optimism 1950s

“Machines will be capable, within twenty years, of doing any work a man can do.”
–Herbert Simon, 1952



Underwhelming Results 1950s to 1980s

The spirit is willing but the flesh is weak.



(Russian)



The vodka is good but the meat is rotten.

The world is too complex



BRACE YOURSELVES

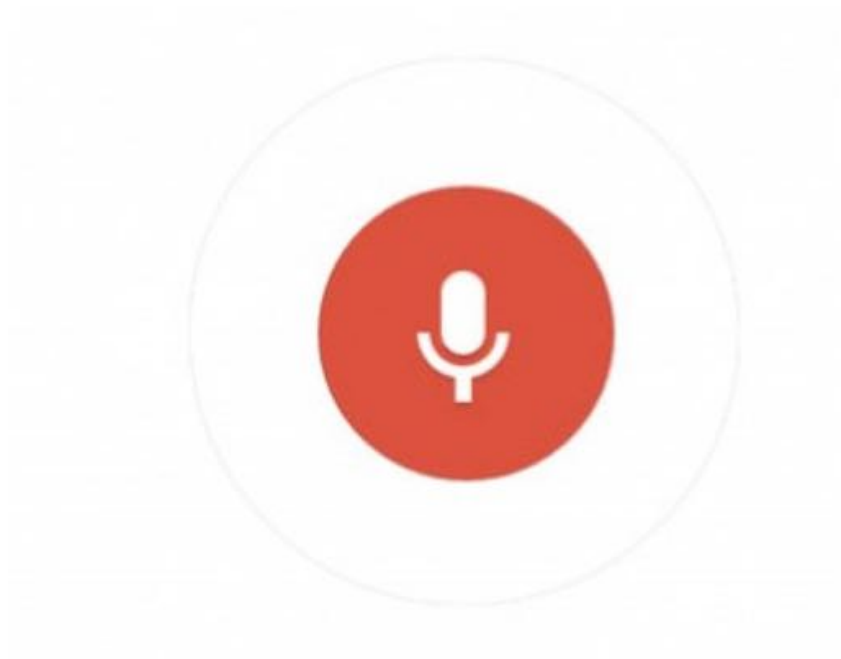


WINTER IS COMING

Big Milestones



Told Speech Was 30 Years Out



Almost perfect...



The Last Remaining Board Game



Computers Making Art



Self Driving Cars



What is going on?

[more suspense]

Story of Modern AI

Focus on one problem

Make a Harry Potter Sorting Hat



Classification



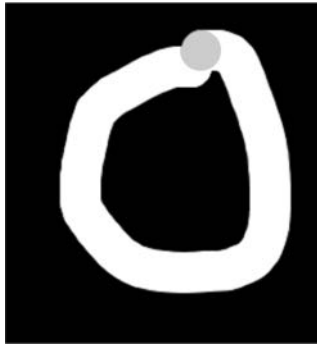
That is a picture
of a **one**



Classification



That is a picture
of a **zero**



Classification



That is a picture
of an **zero**



* It doesn't have to be
correct all of the time



Can you do it?





How about now?

What a computer sees

0	0	1	0	1	0	1	0	0	0	1	1	1	0	1
1	0	0	1	0	1	1	1	0	1	0	0	0	0	0
1	1	1	0	1	0	0	1	1	0	0	1	0	1	0
1	1	1	1	1	0	0	0	0	0	1	1	0	1	1
0	0	0	1	1	0	0	1	0	0					
1	0	0	1	1	0	0	0	1	0					
1	1	0	1	1	0	0	1	1	0					
1	0	1	0	0	1	0	0	1	0					
0	0	0	0	1	0	1	0	1	1					
0	1	1	0	0	0	0	0	1	1					
0	0	1	0	1	1	1	0	0	0					
0	1	1	1	0	1	0	0	1	0					
1	1	0	0	0	0	0	0	0	0					
0	0	0	0	0	0	0	0	1	1					
0	0	1	1	1	0	1	0	1	1					



What a human sees



Why is it easy for Humans?



About 30% of your cortex is used from vision
3% is used to process hearing



Very hard to Program



```
public class HarryHat extends ConsoleProgram {  
  
    public void run() {  
        println("Todo: Write program");  
    }  
  
}
```



Perhaps there is an insight?

Two Great Ideas

1. Artificial Neurons

2. Learn by Example

Two Great Ideas

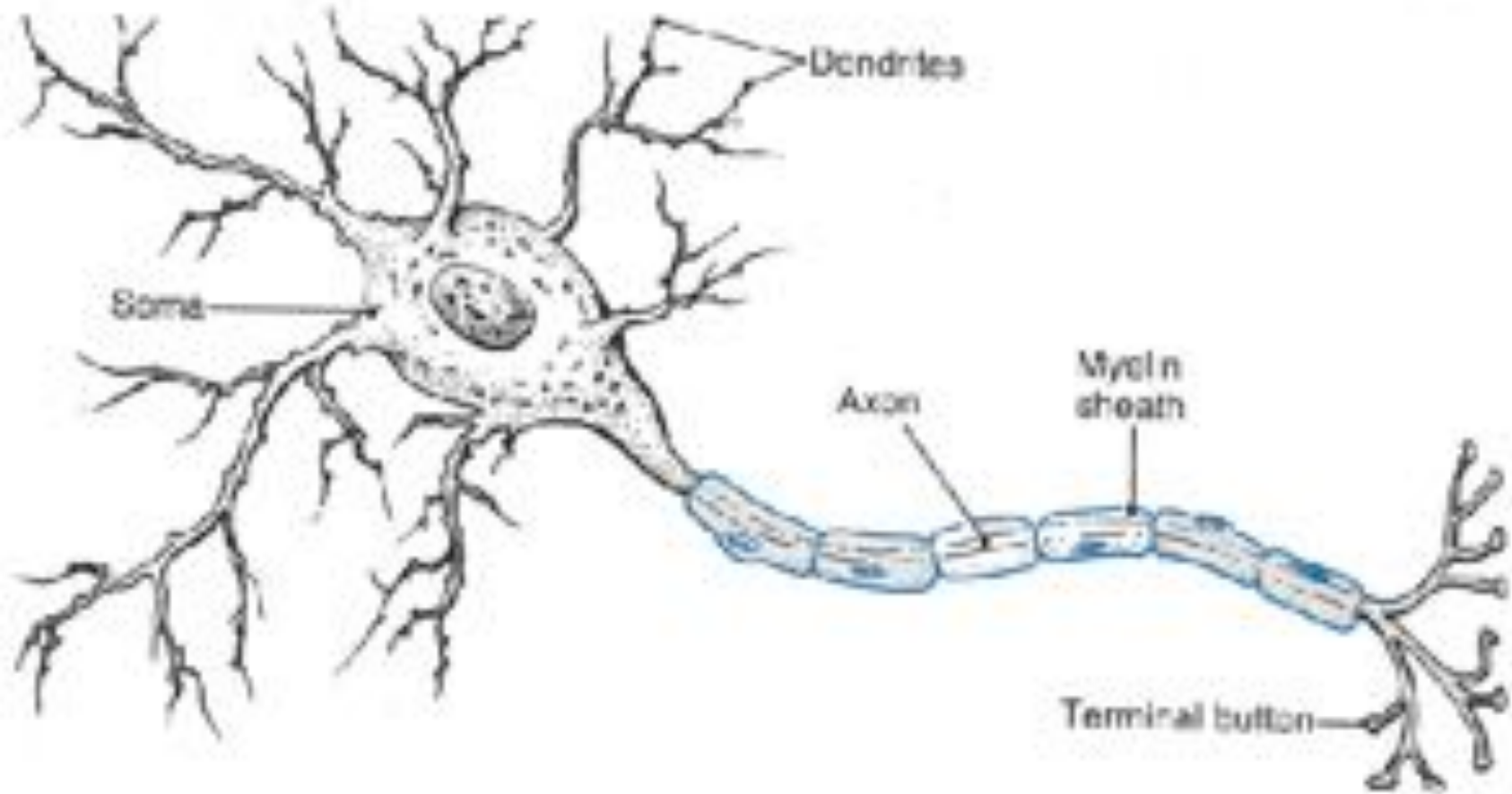
1. Artificial Neurons

2. Learn by Example

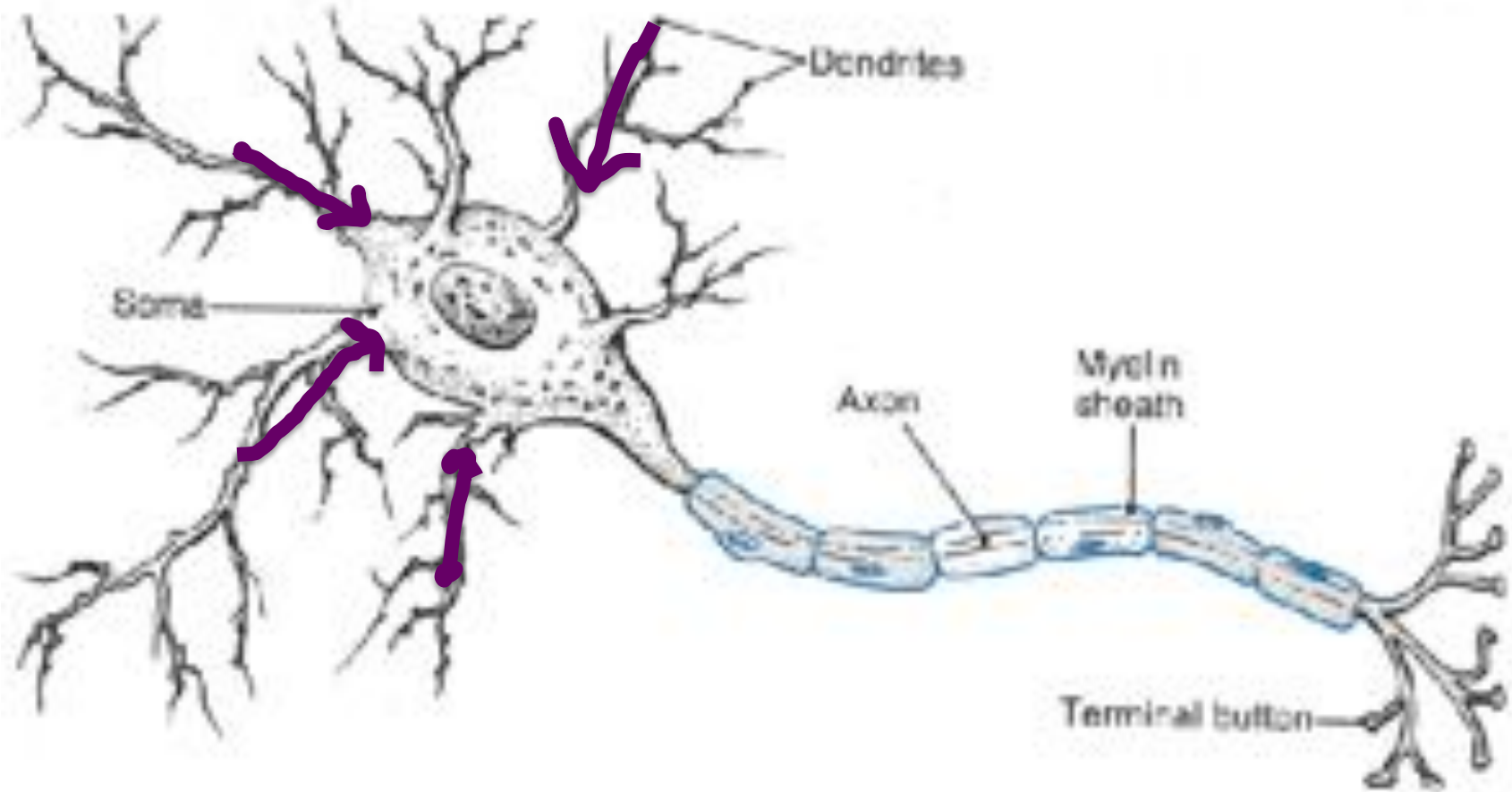
1. Artificial Neurons



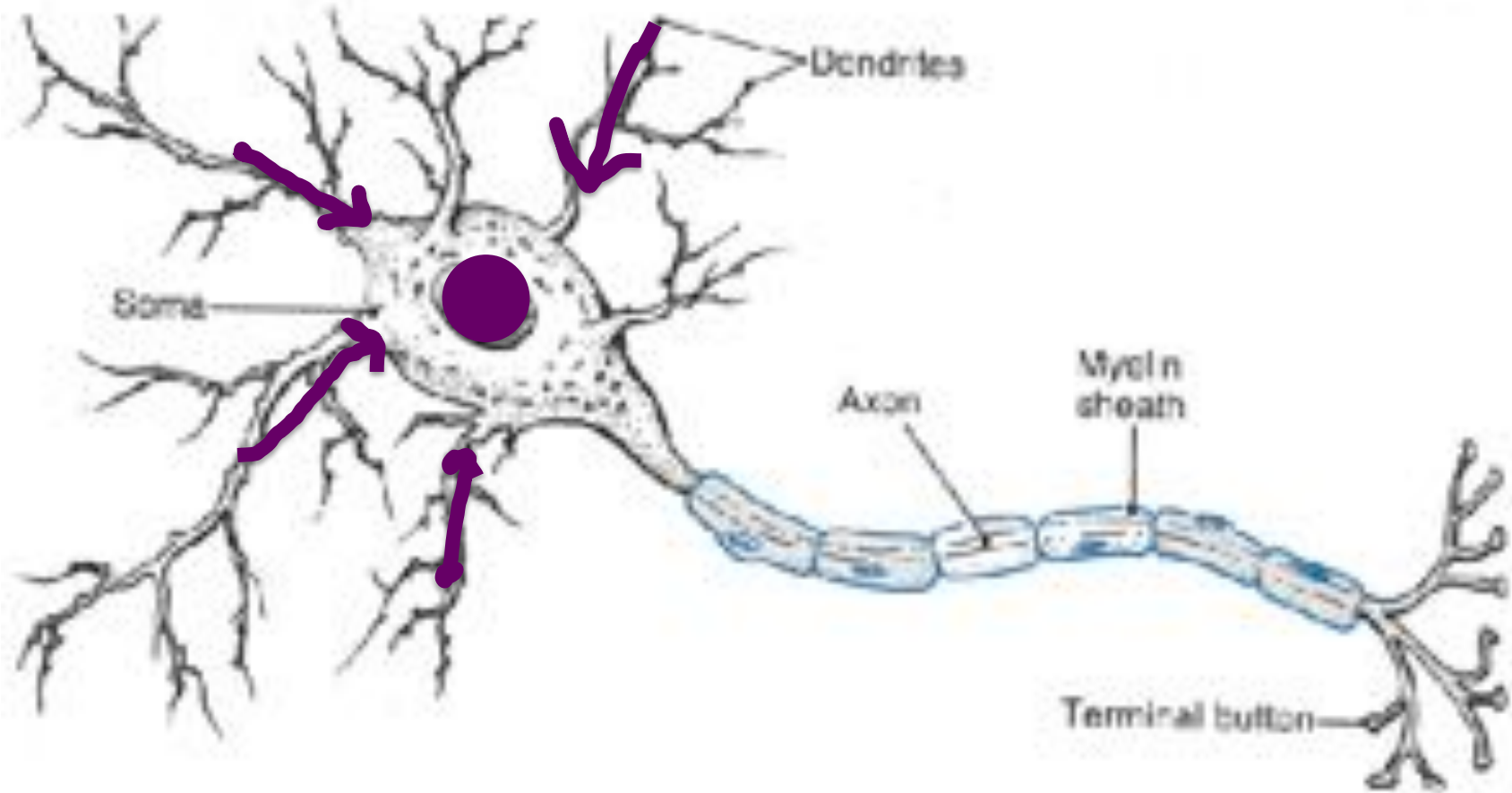
Neuron



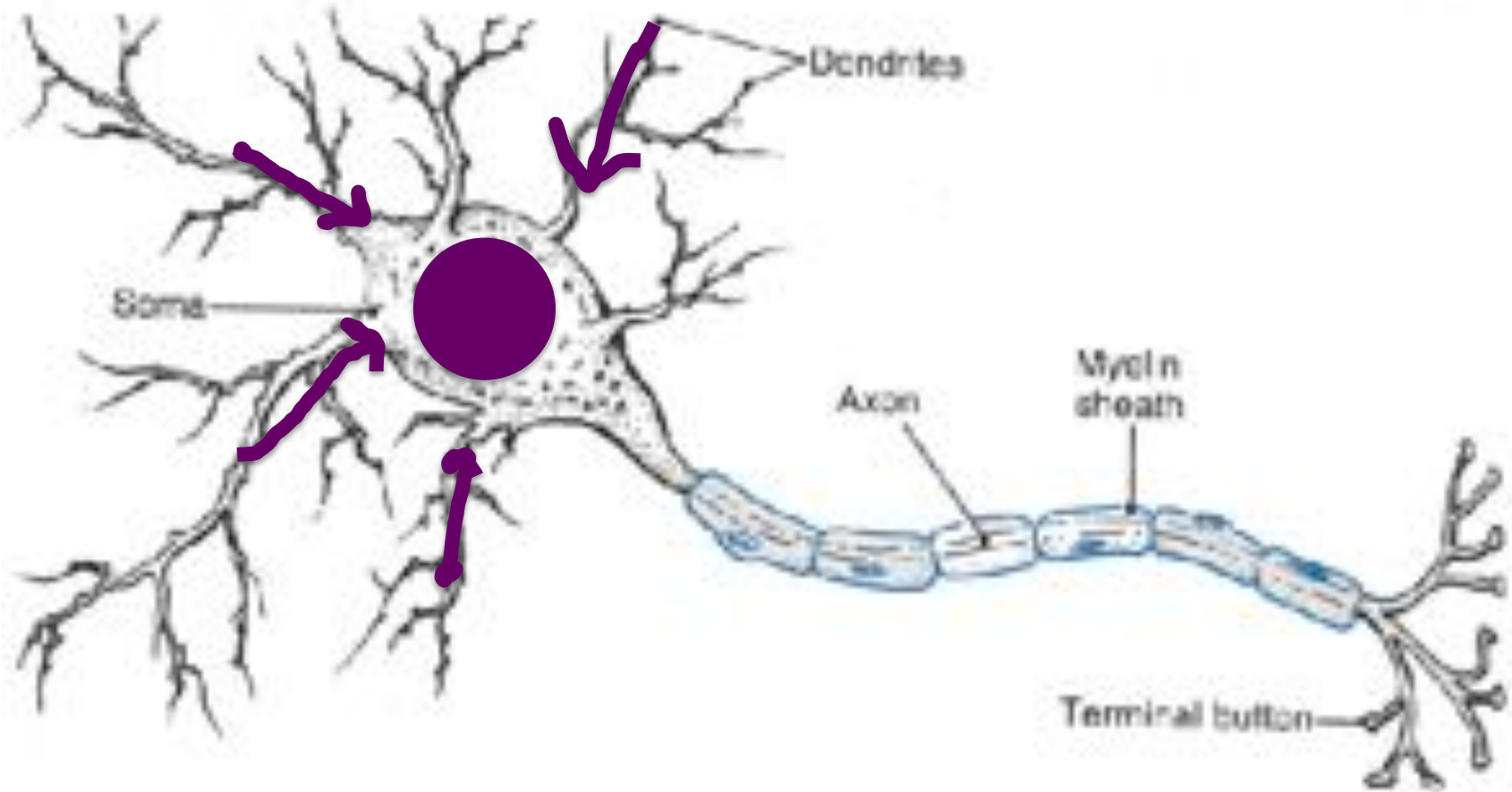
Neuron



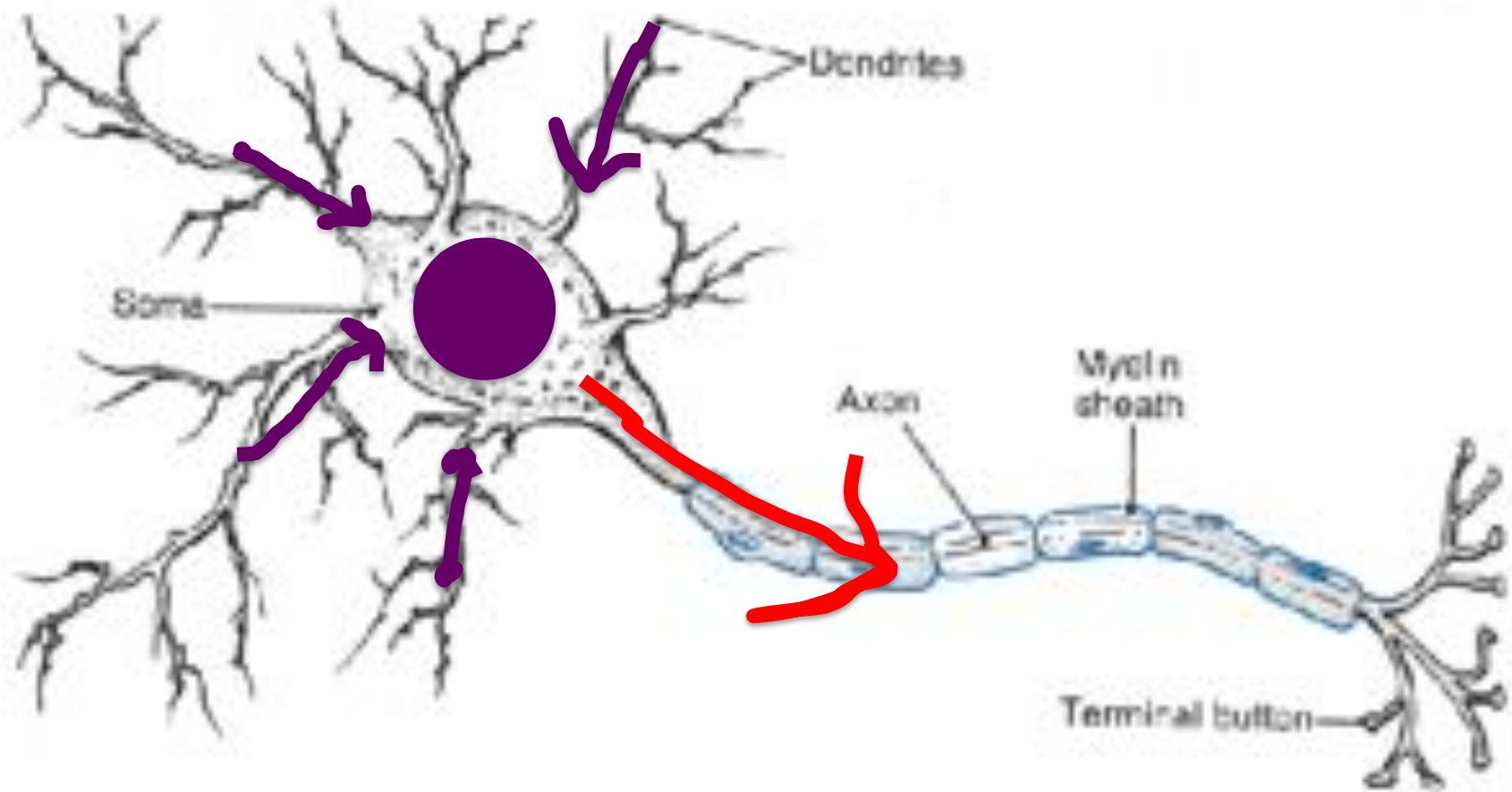
Neuron



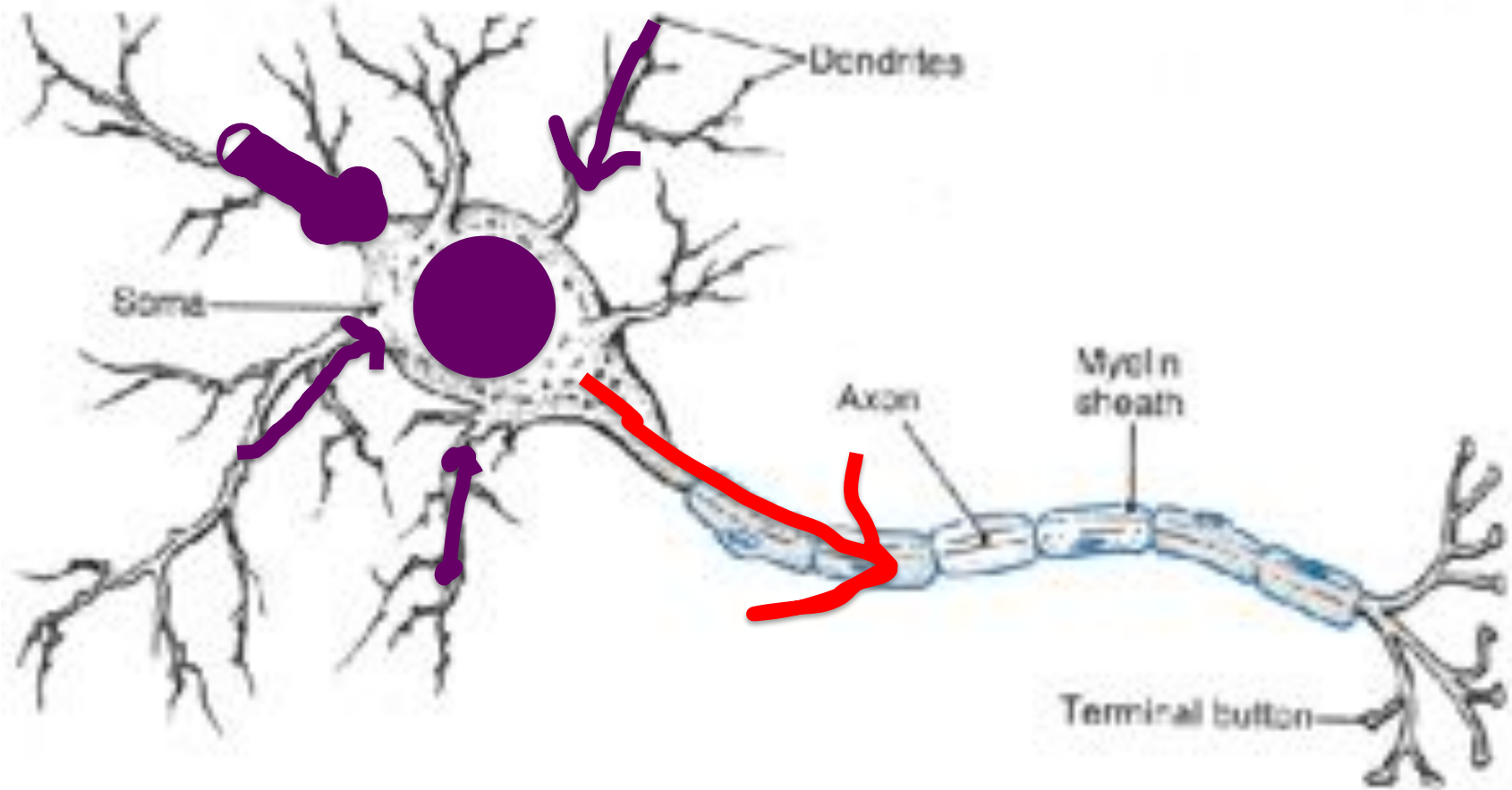
Neuron



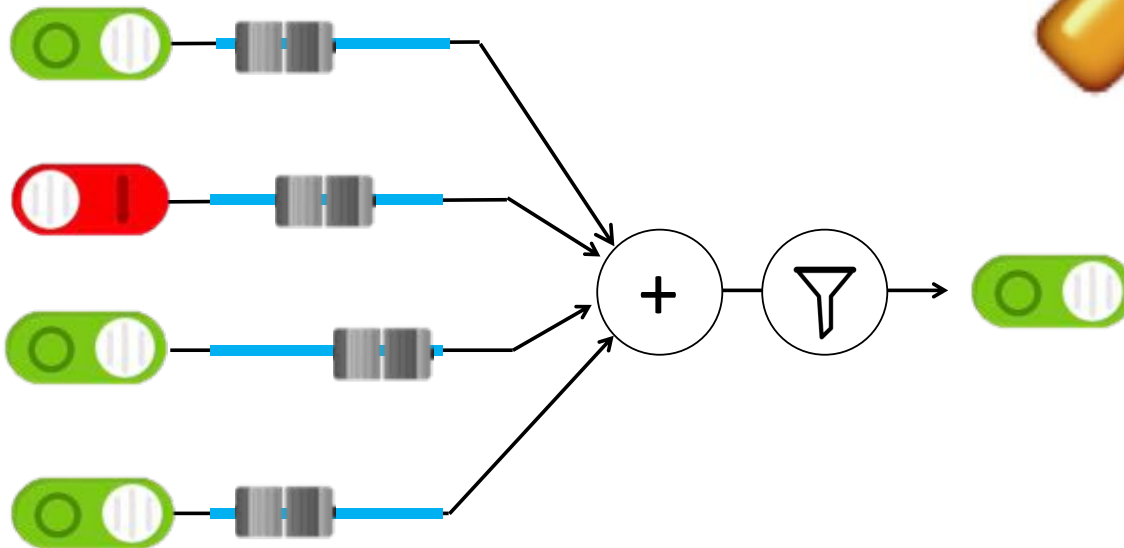
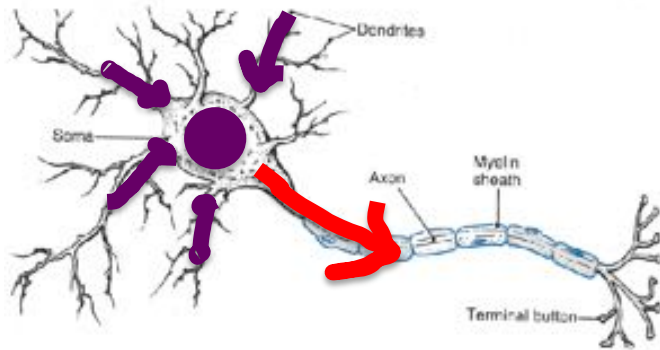
Neuron



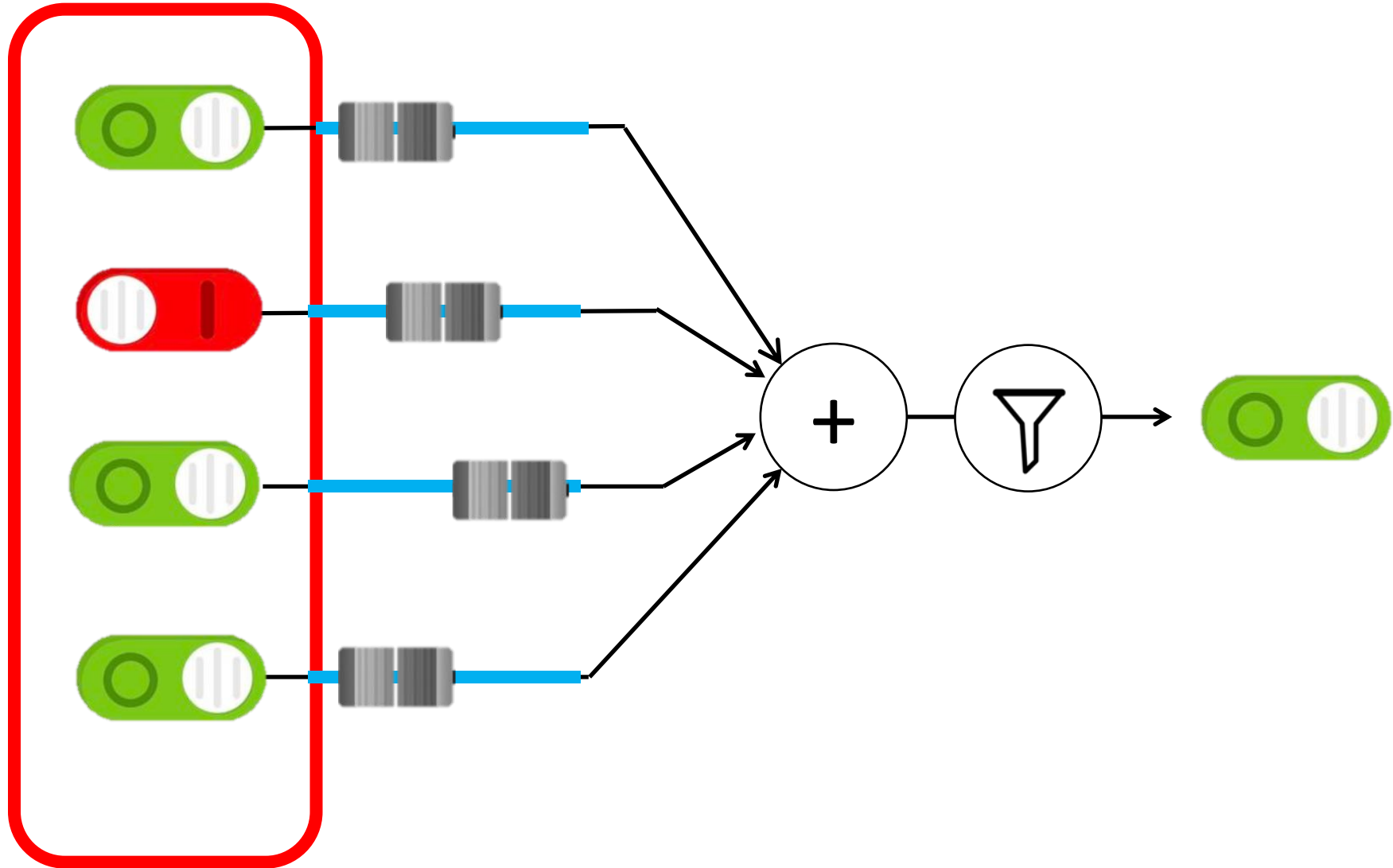
Some Inputs are More Important



Artificial Neuron



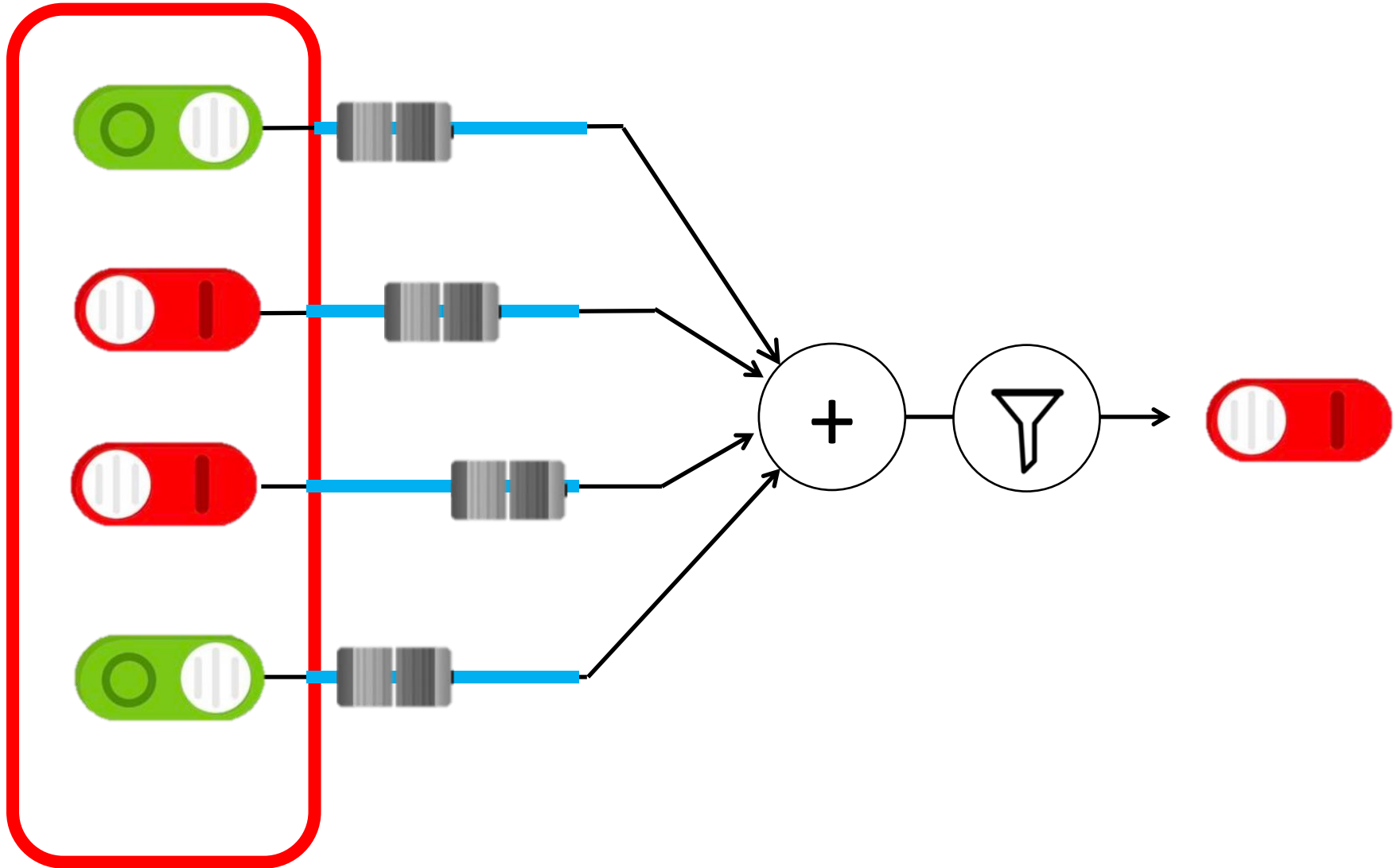
Inputs



Numbers between 0 and 1



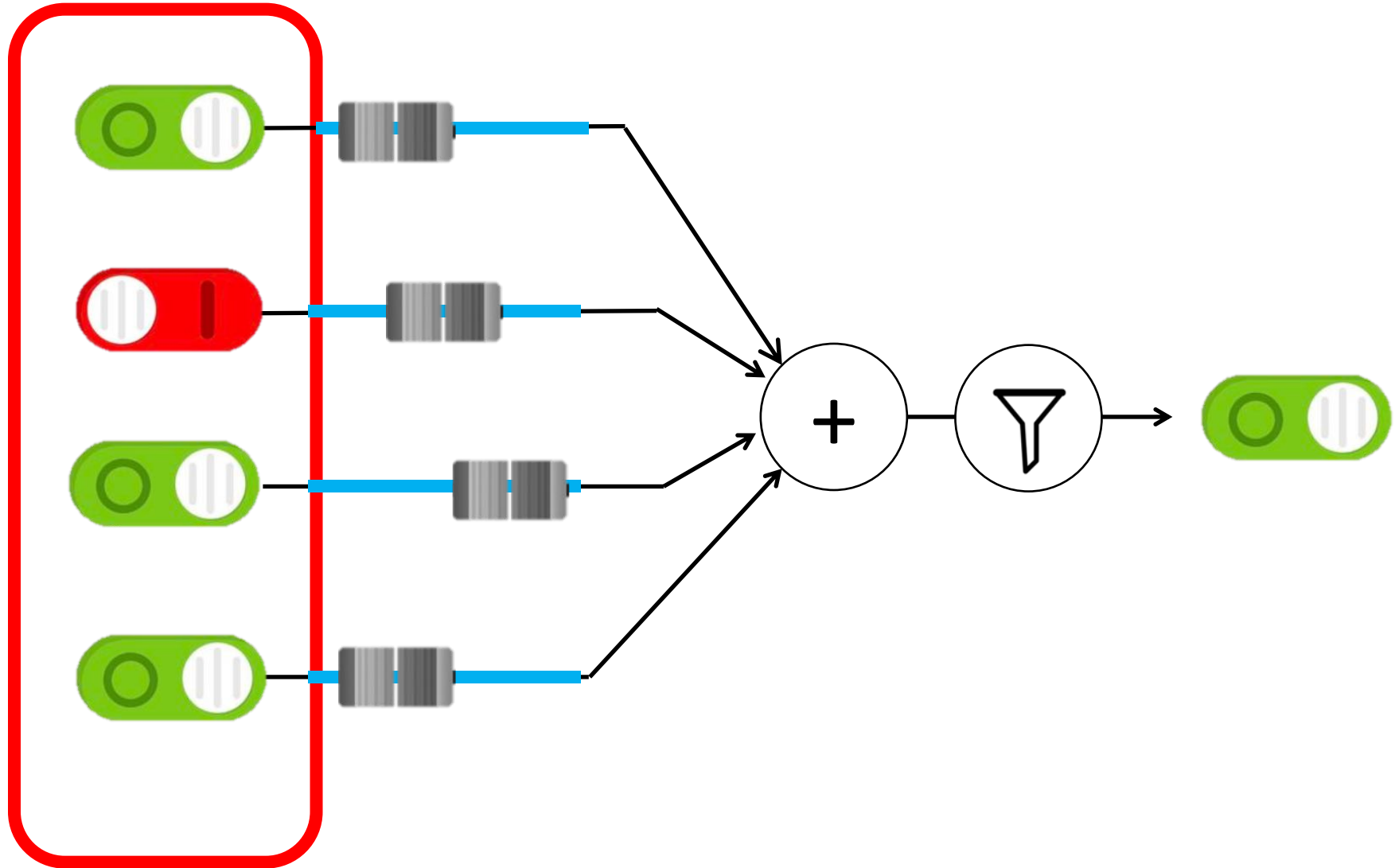
Inputs



Numbers between 0 and 1



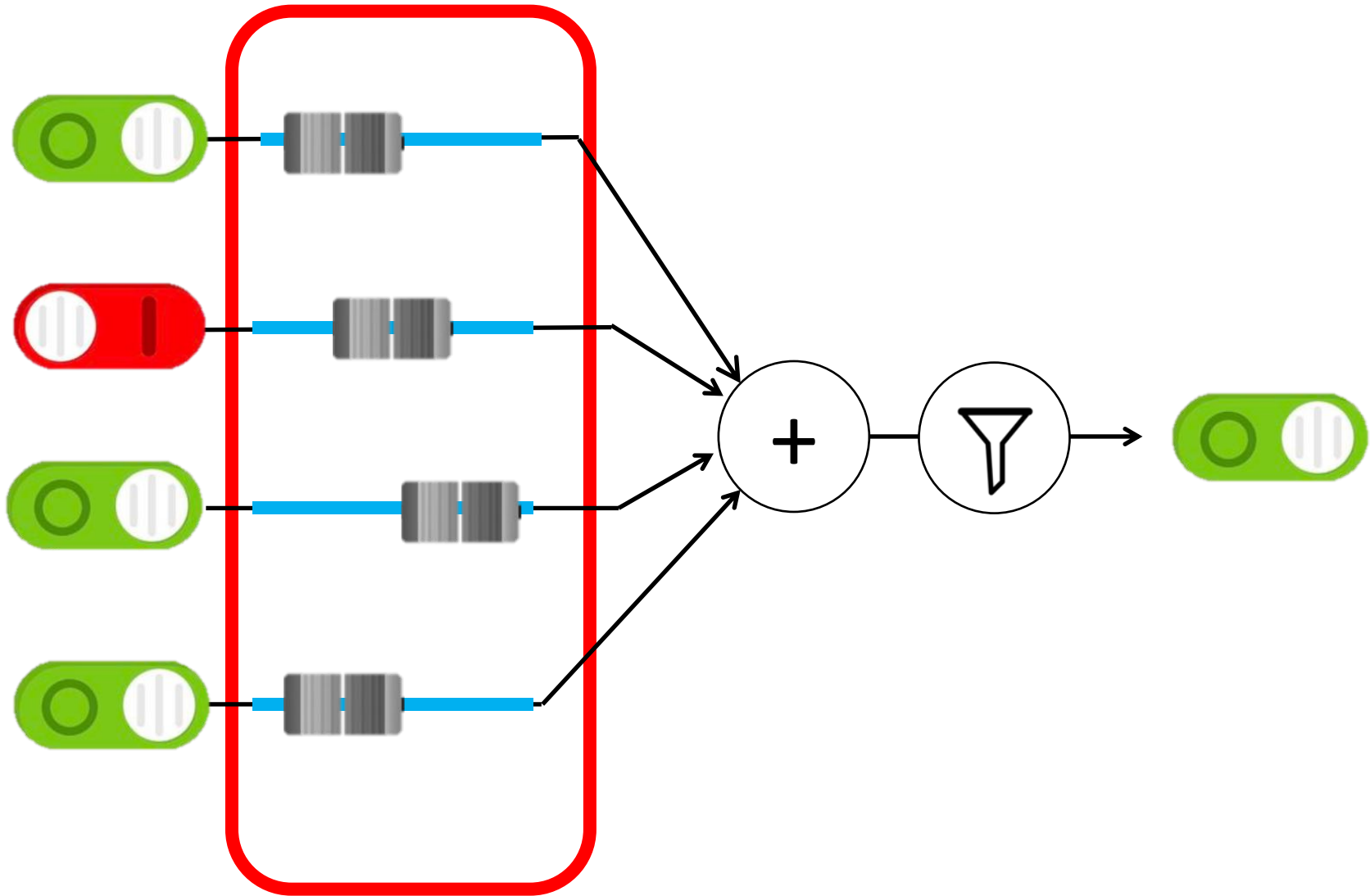
Inputs



Numbers between 0 and 1



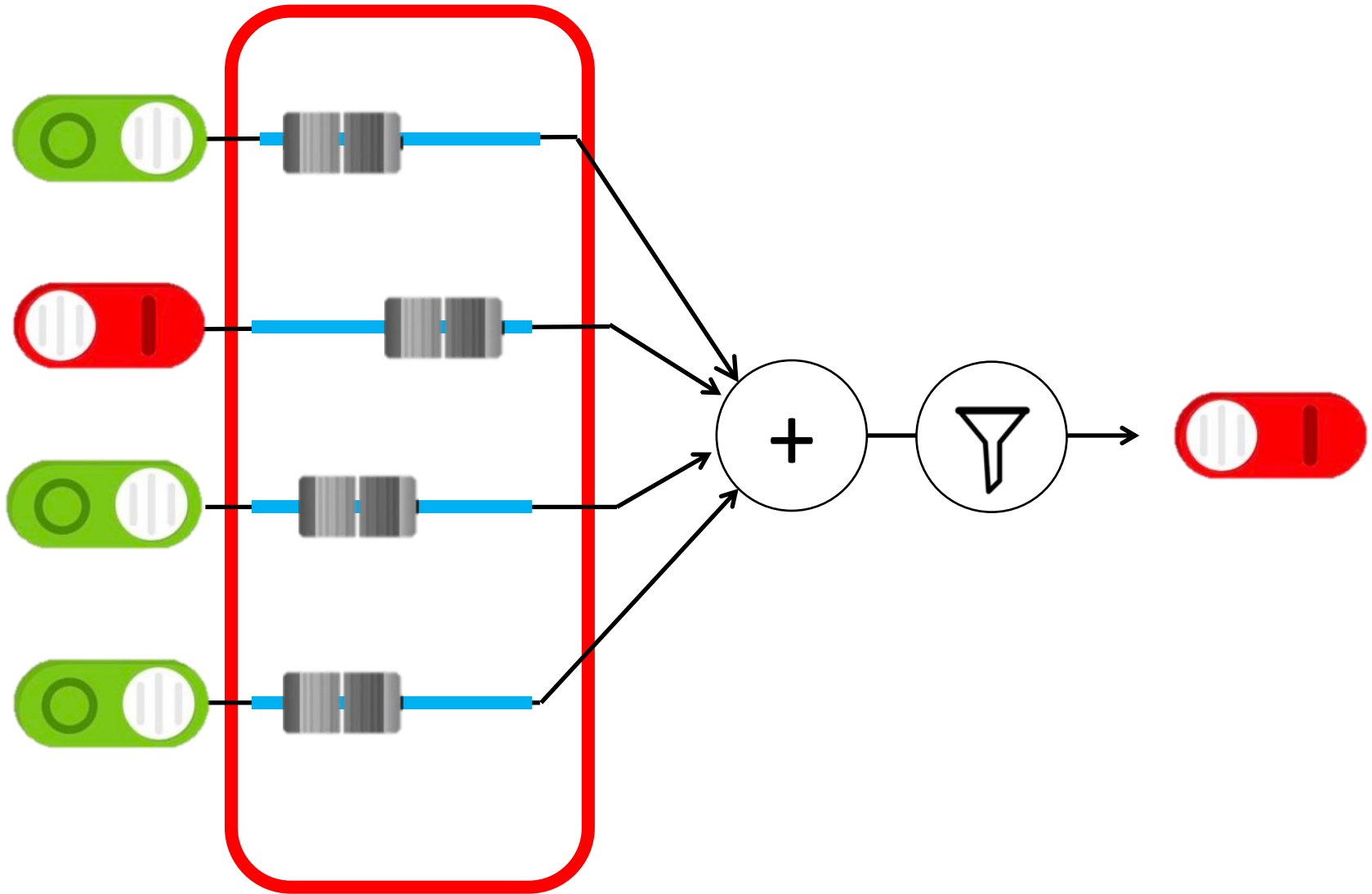
Weights



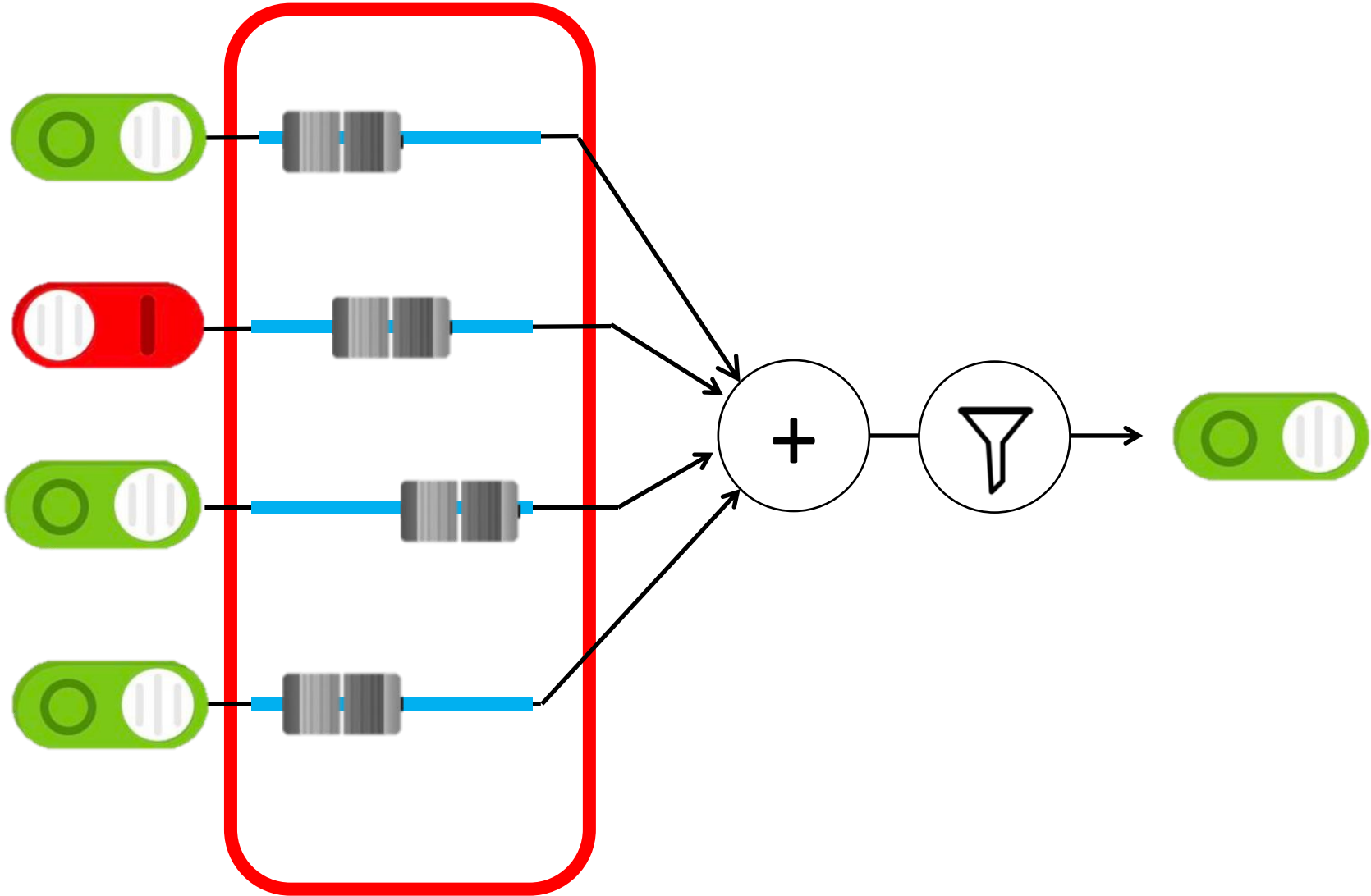
Negative or positive numbers



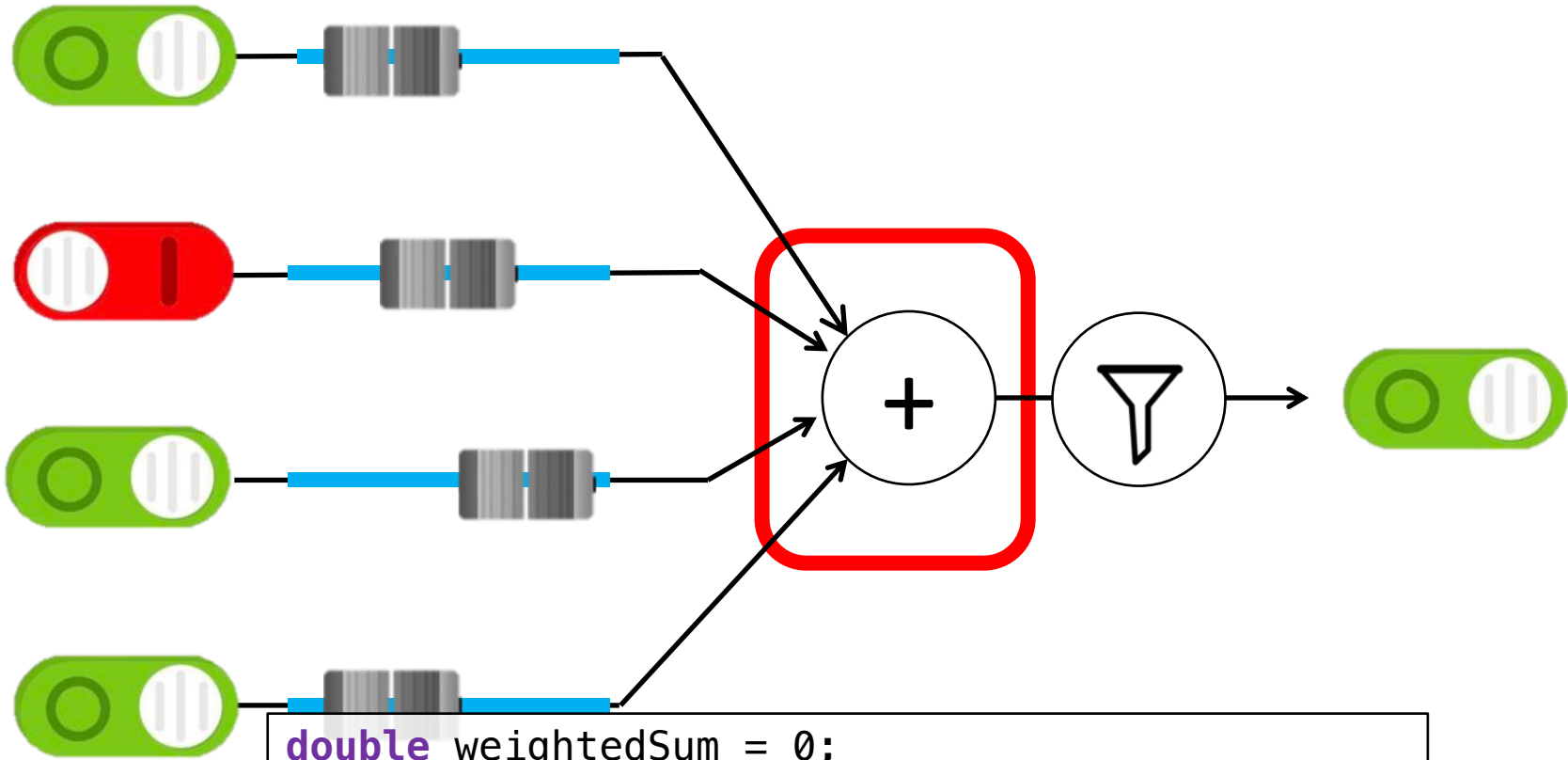
Weights



Weights



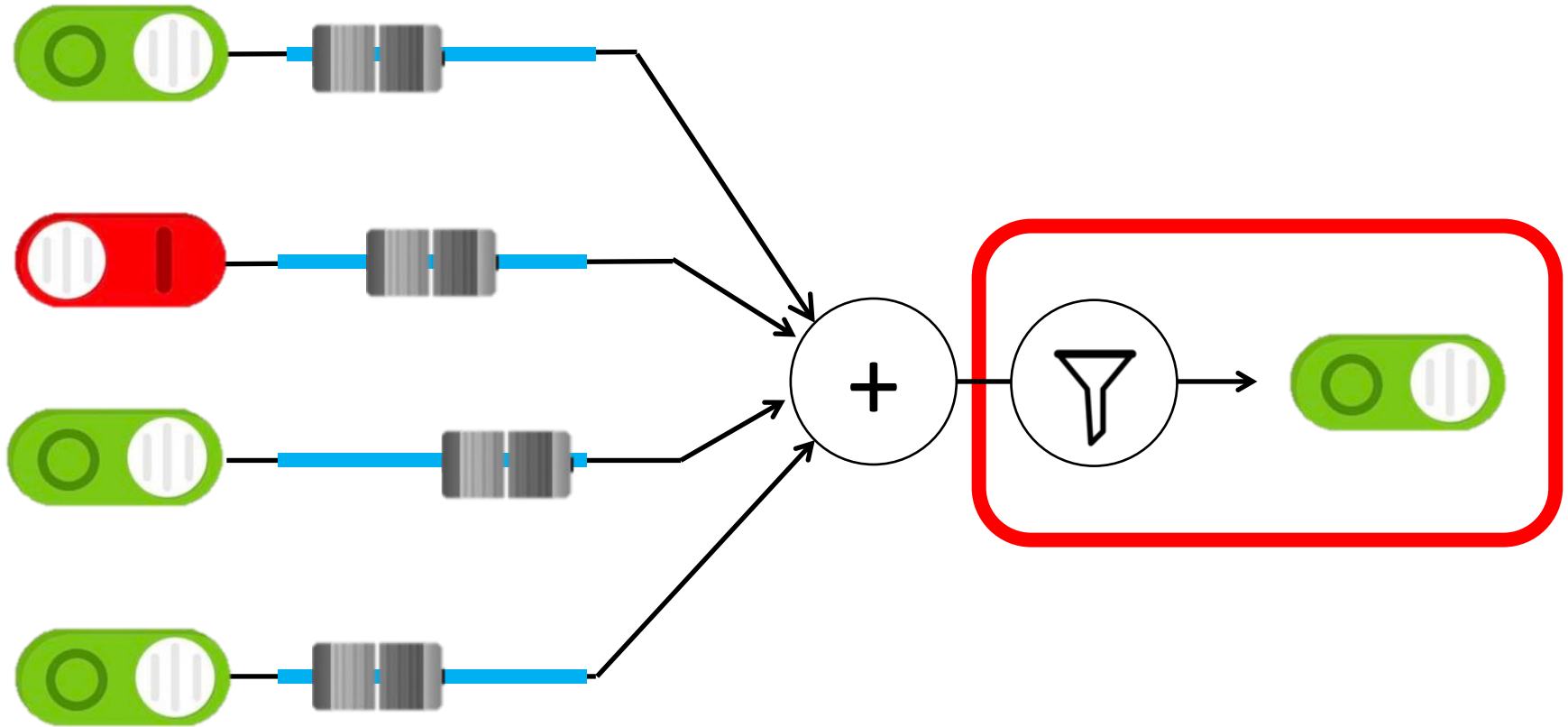
Weighted Sum



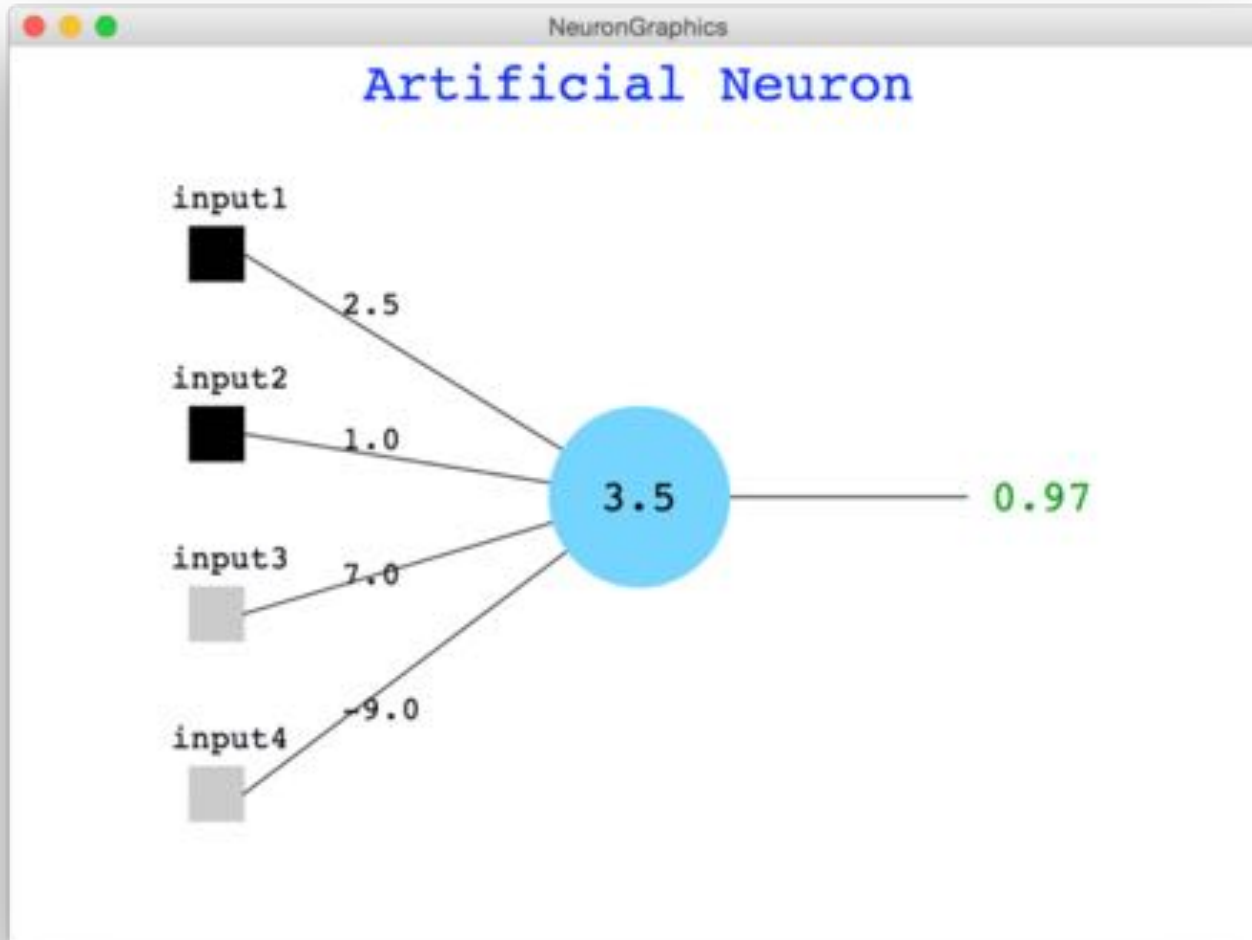
```
double weightedSum = 0;  
weightedSum = weightedSum + input0 * weight0;  
weightedSum = weightedSum + input1 * weight1;  
weightedSum = weightedSum + input2 * weight2;  
weightedSum = weightedSum + input3 * weight3;
```



Filter and Output

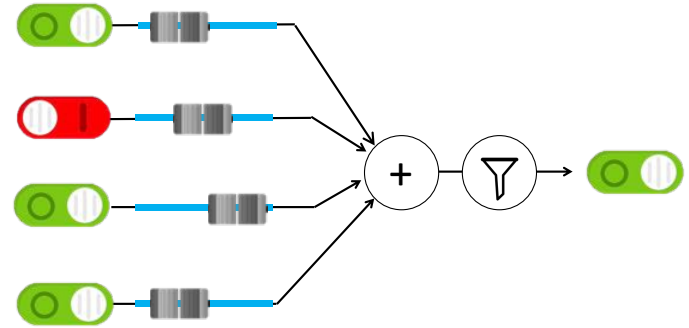
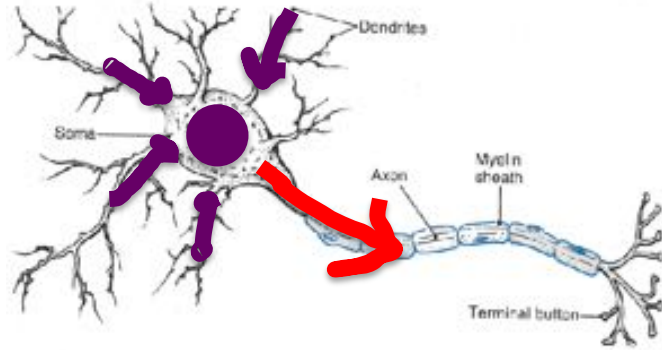


Java Demo

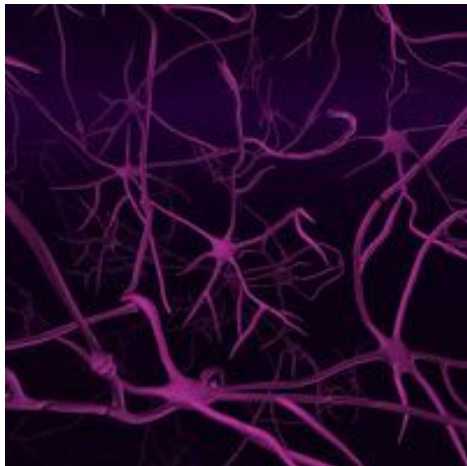


Biological Basis for Neural Networks

- A neuron



- Your brain

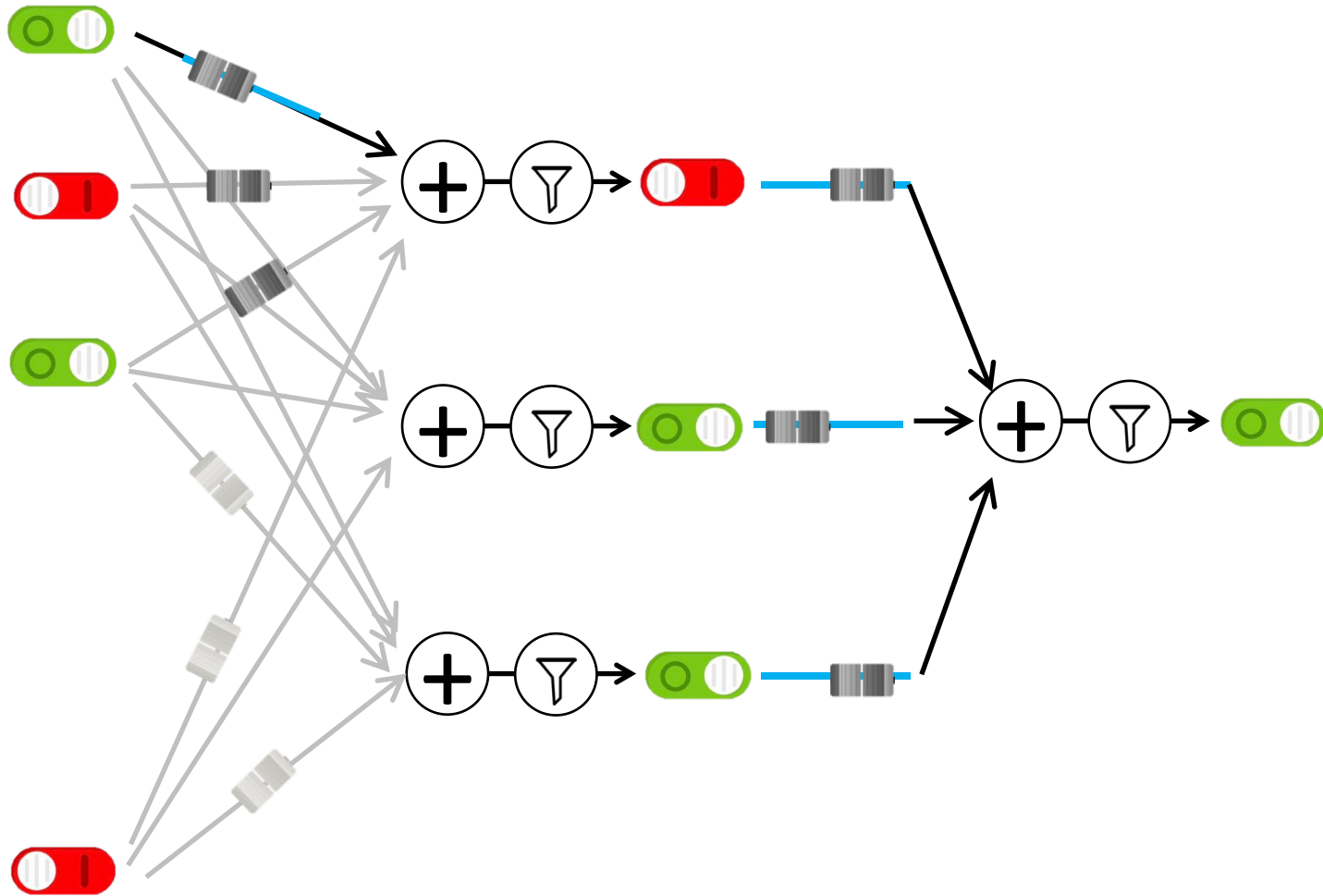


???

Actually, it's probably someone else's brain

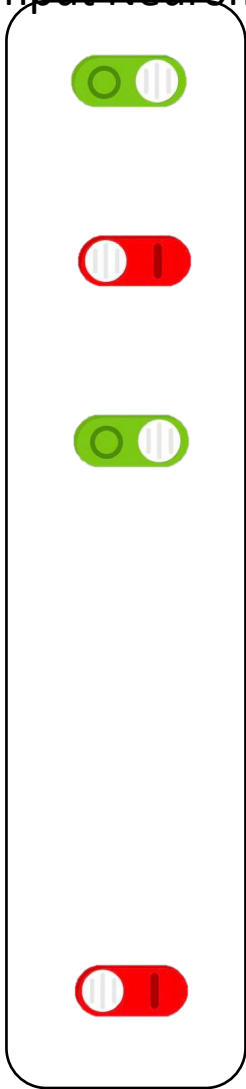


Put Many Together

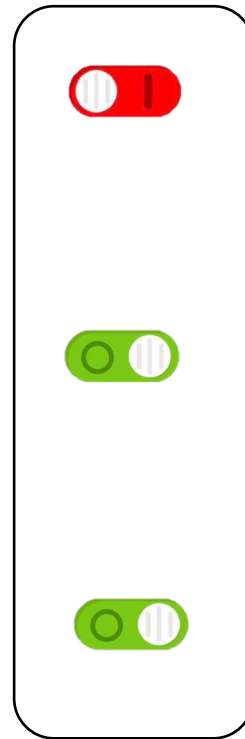


Put Many Together

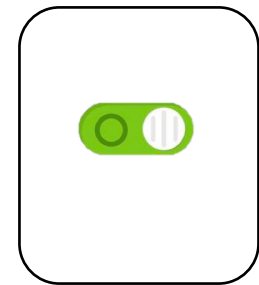
Input Neurons



Hidden Neurons



Output Neurons

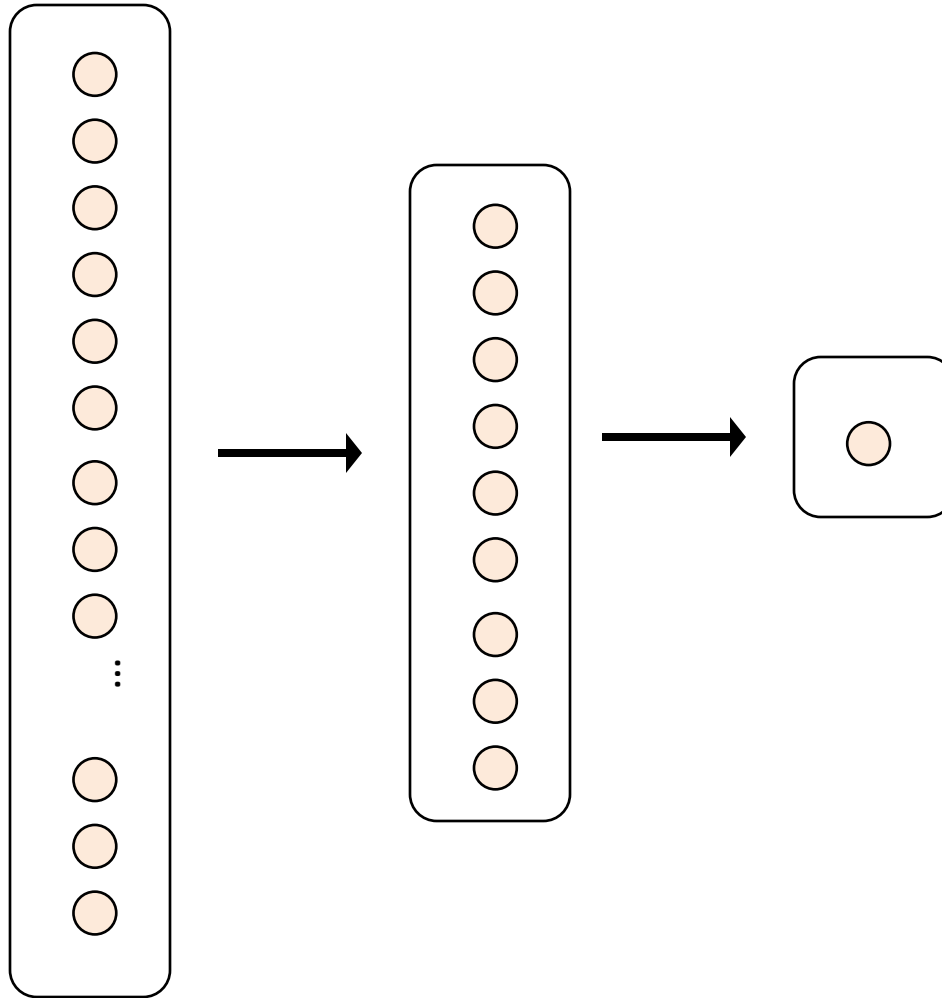


Making a Prediction

Input Neurons

Hidden Neurons

Output Neurons

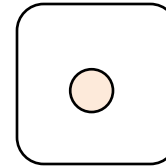
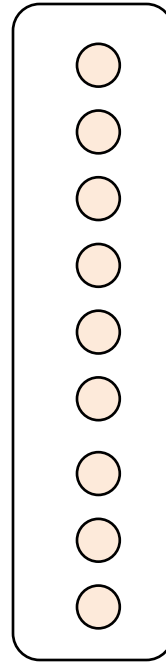
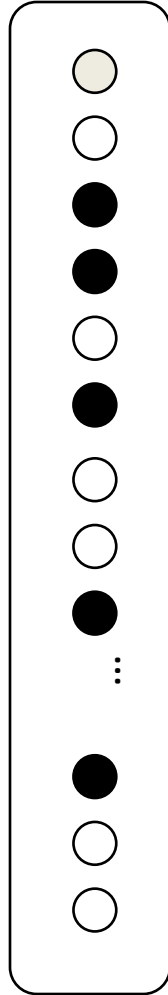


Making a Prediction

Input Neurons

Hidden Neurons

Output Neurons

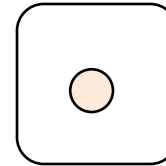
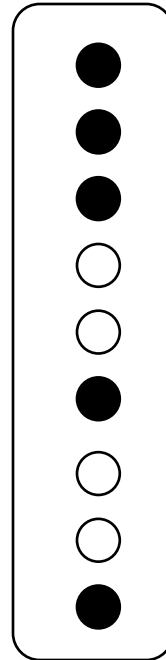
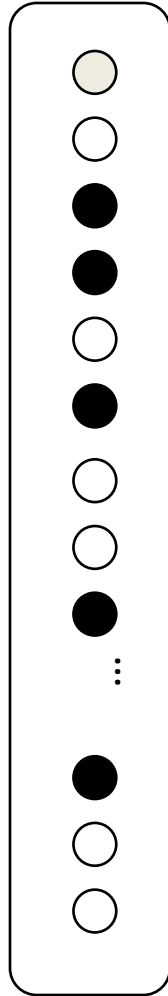


Making a Prediction

Input Neurons

Hidden Neurons

Output Neurons

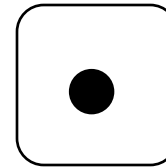
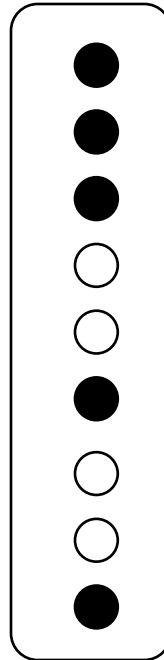
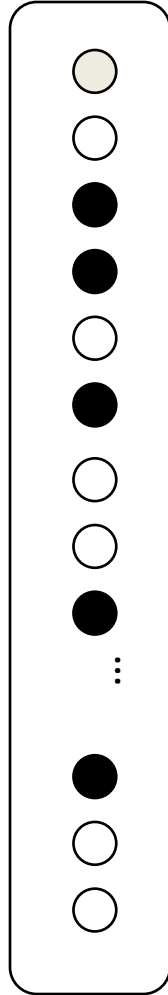


Making a Prediction

Input Neurons

Hidden Neurons

Output Neurons






I think that is
a picture of a
one!



Demonstration

Draw your number here



X  

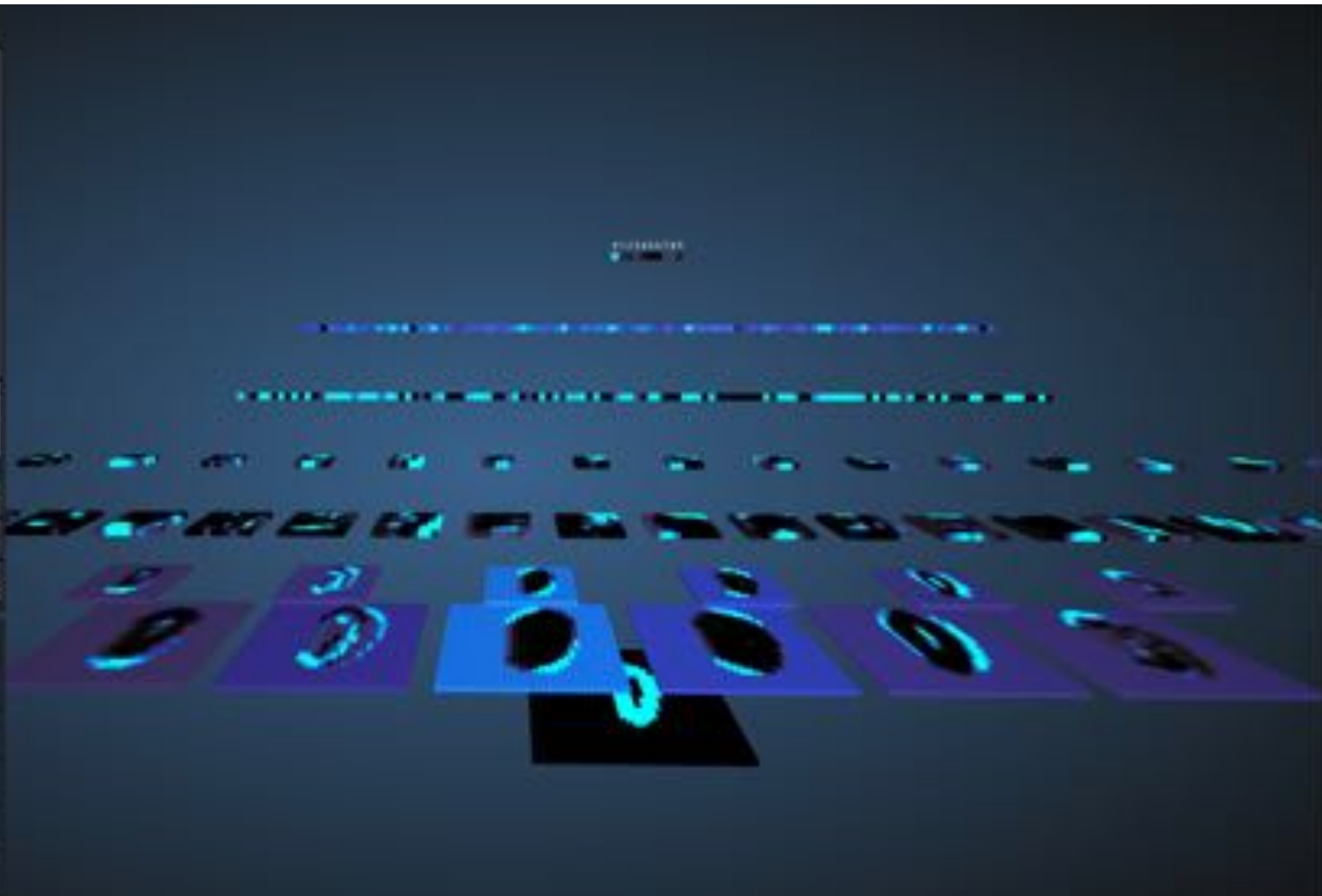
Downsampled drawing:

First guess:

Second guess:

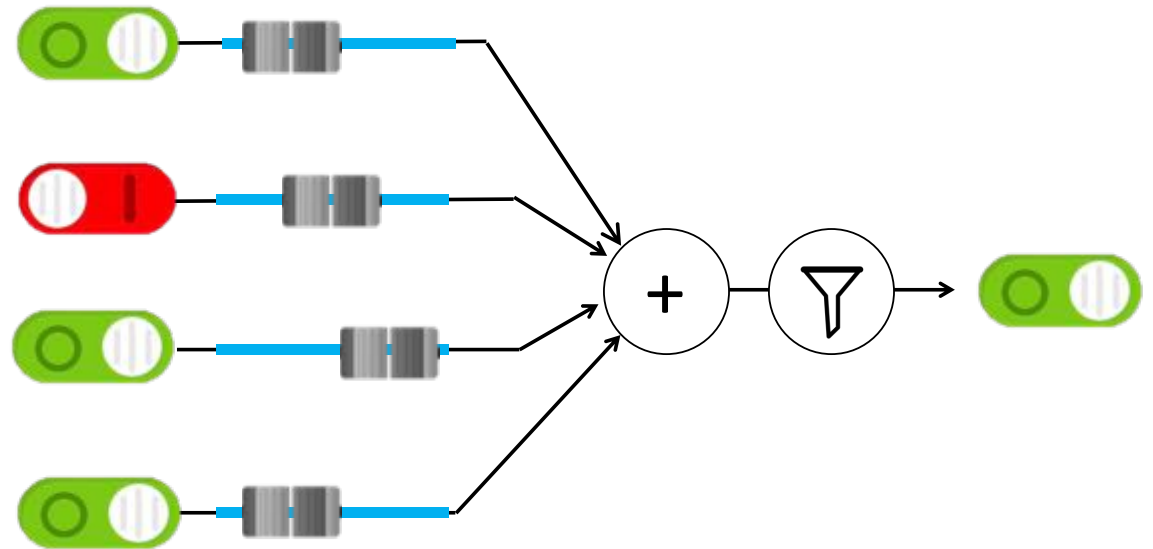
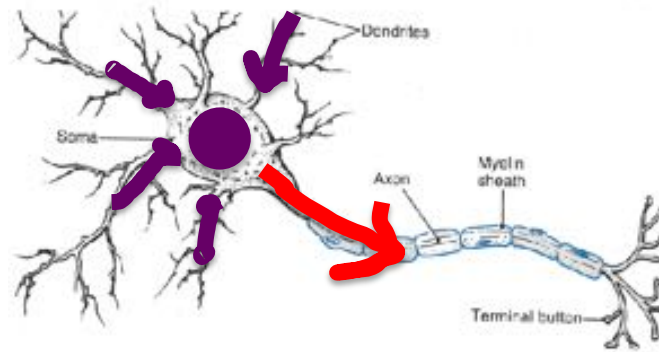
Layer visibility

Input layer	Show
Convolution layer 1	Show
Downsampling layer 1	Show
Convolution layer 2	Show
Downsampling layer 2	Show



<http://scs.ryerson.ca/~aharley/vis/conv/>

Great Idea: Artificial Neurons





Neural Networks get their intelligence from their sliders (parameters)



Two Great Ideas

1. Artificial Neurons

2. Learn by Example

Two Great Ideas

1. Artificial Neurons

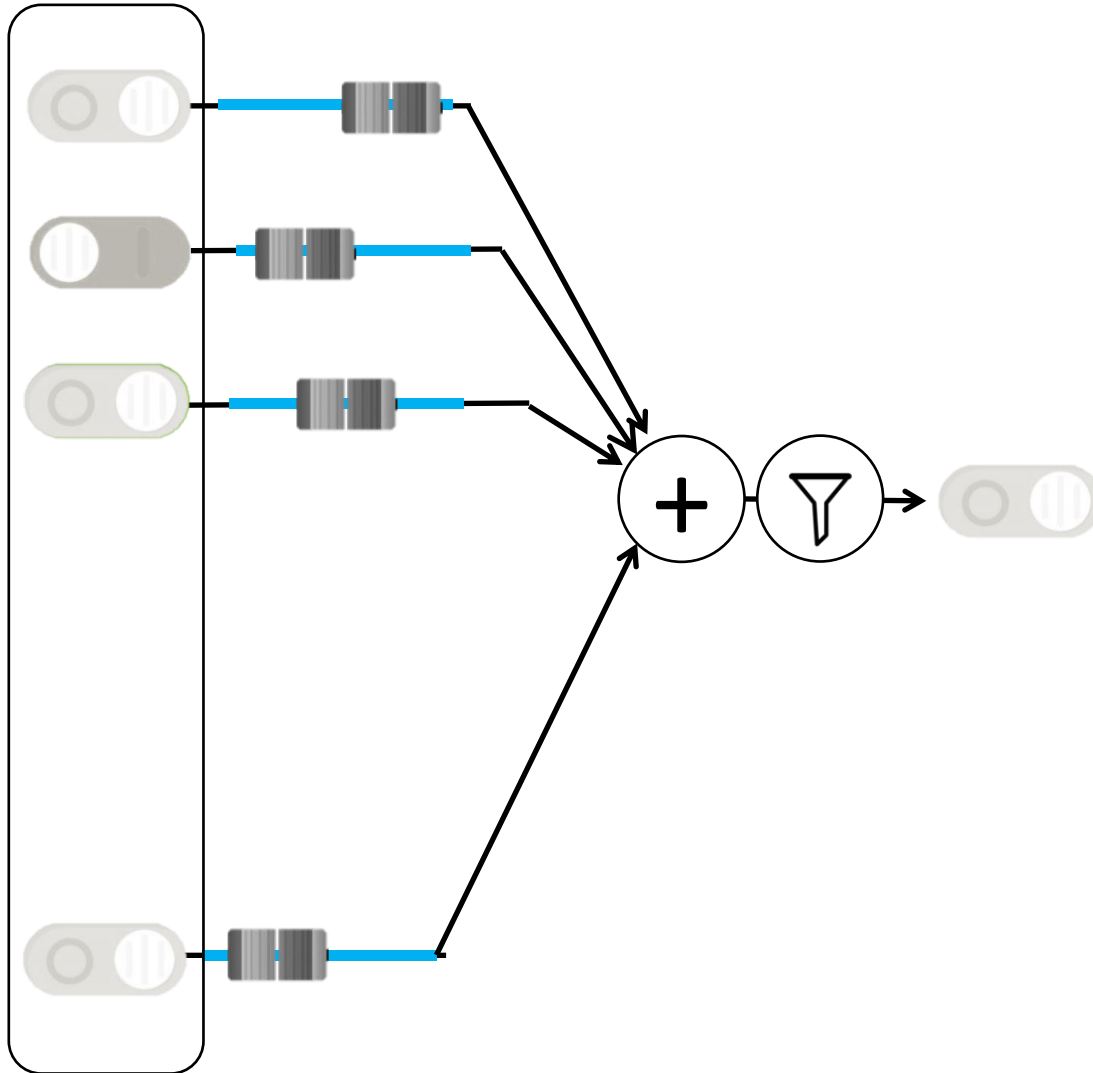
2. Learn by Example

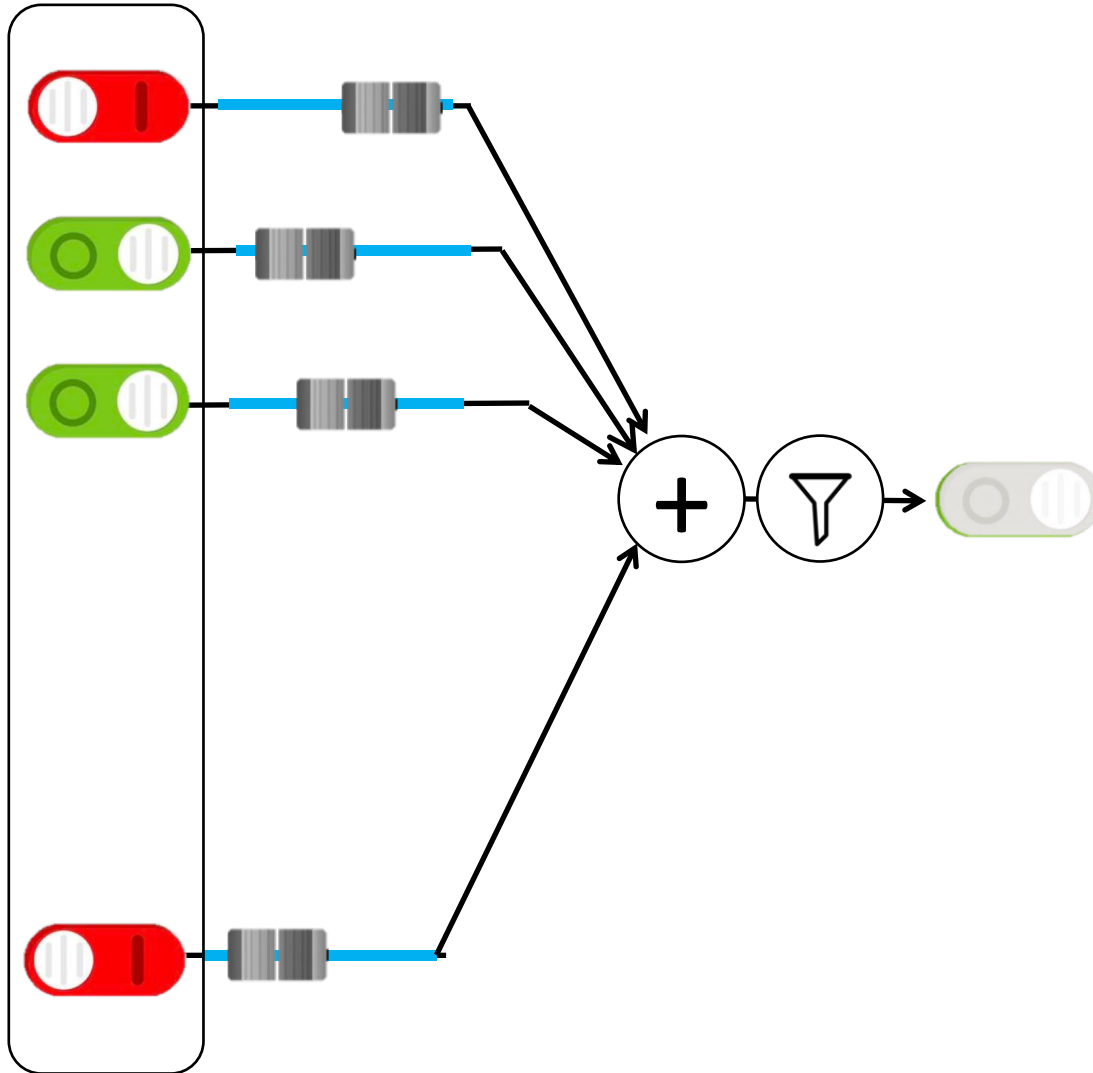
2. Learn From Experience

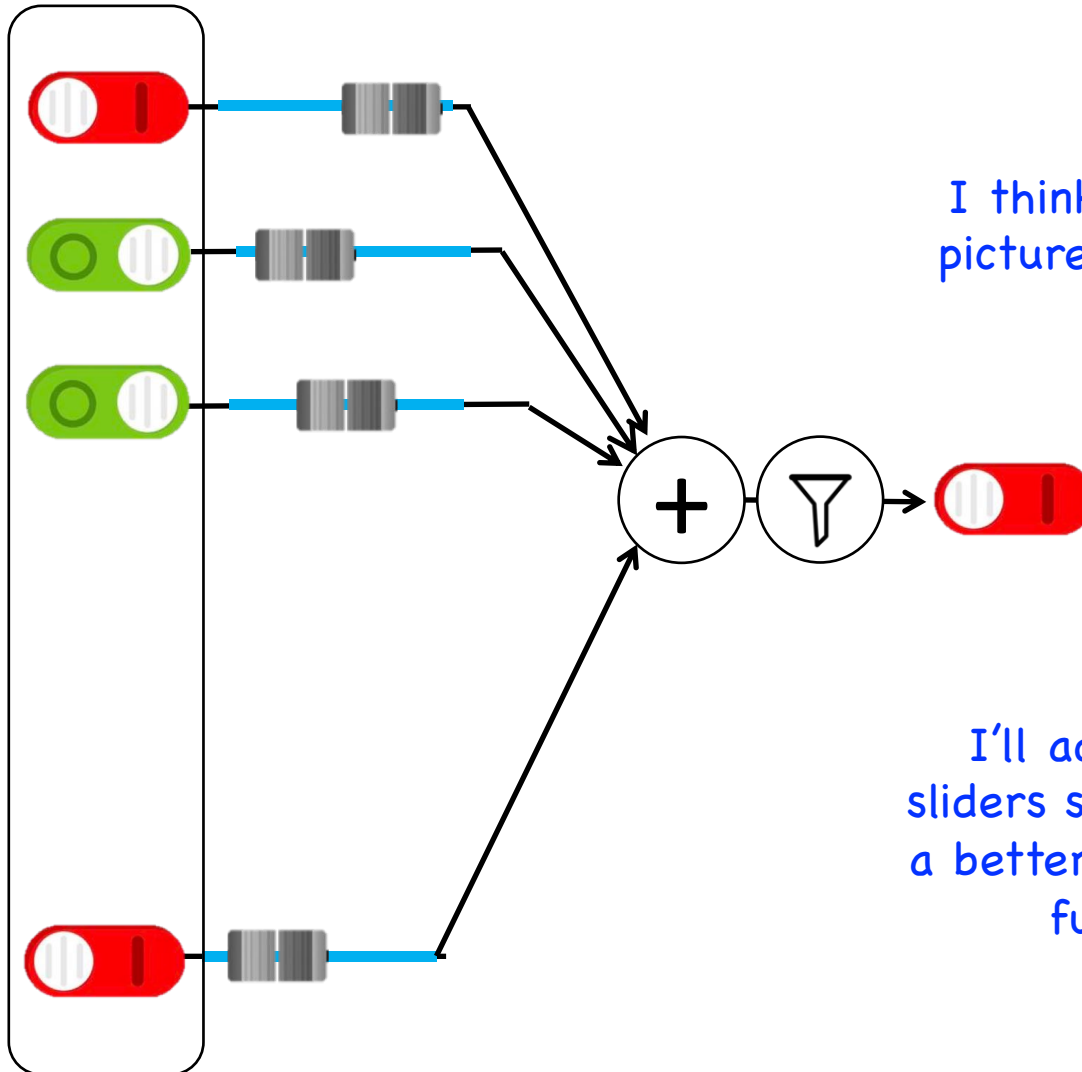


Learn by Example







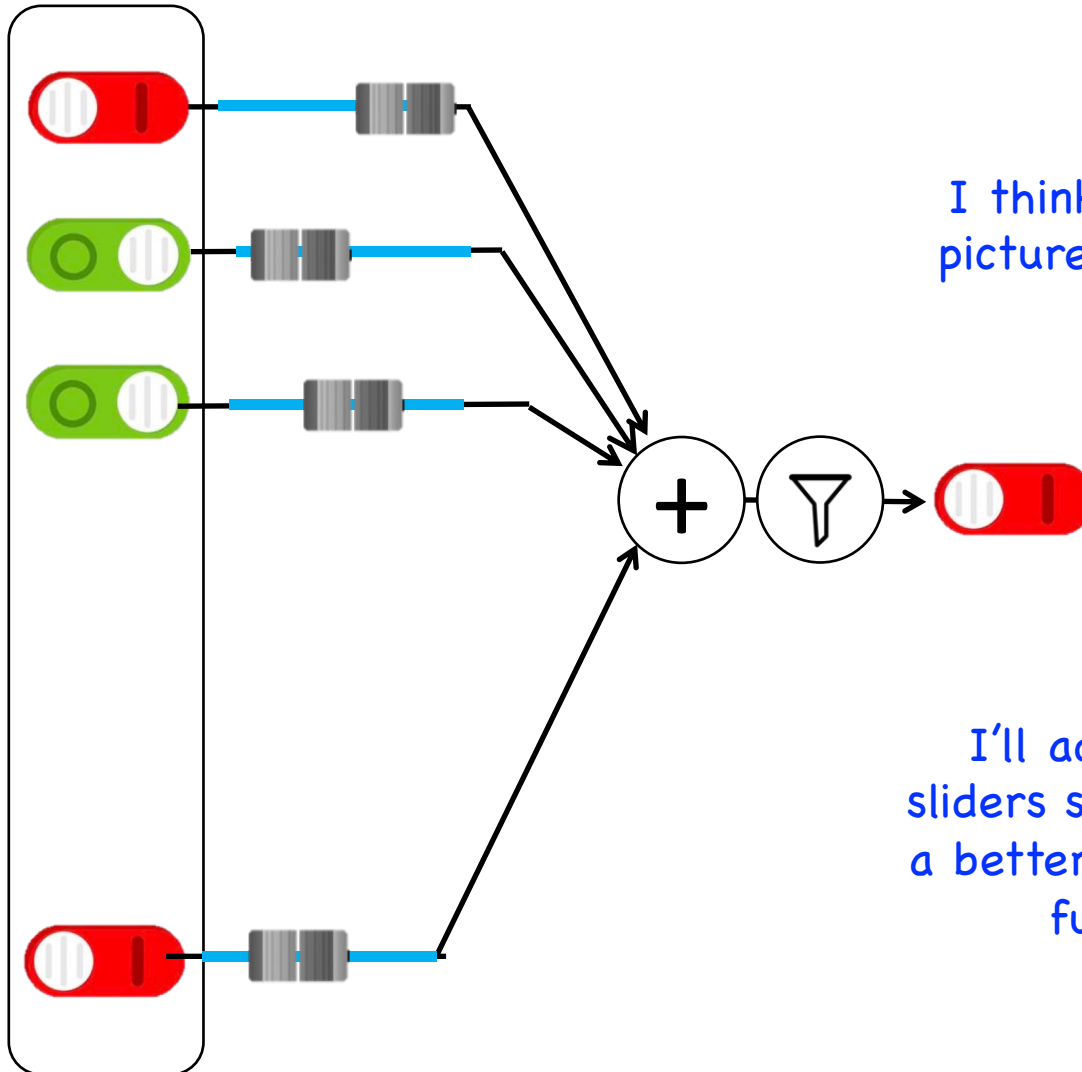
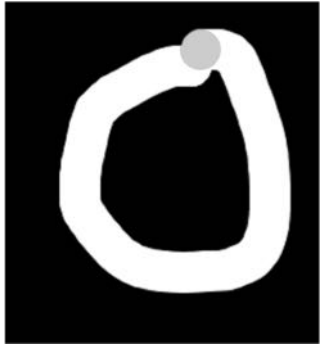


I think that is a picture of a **One!**

What do you mean it's actually a **Zero?**

I'll adjust my sliders so that I do a better job in the future



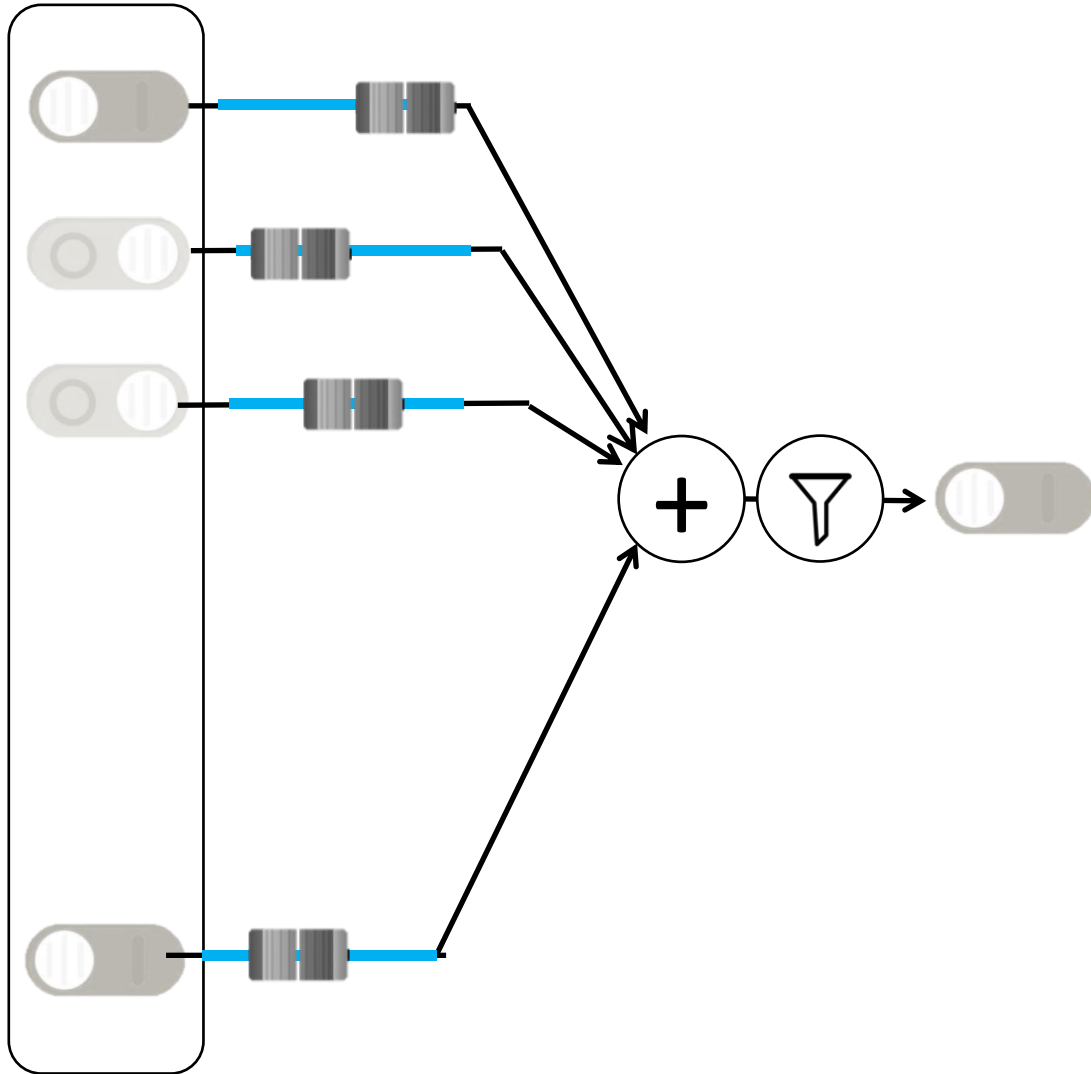


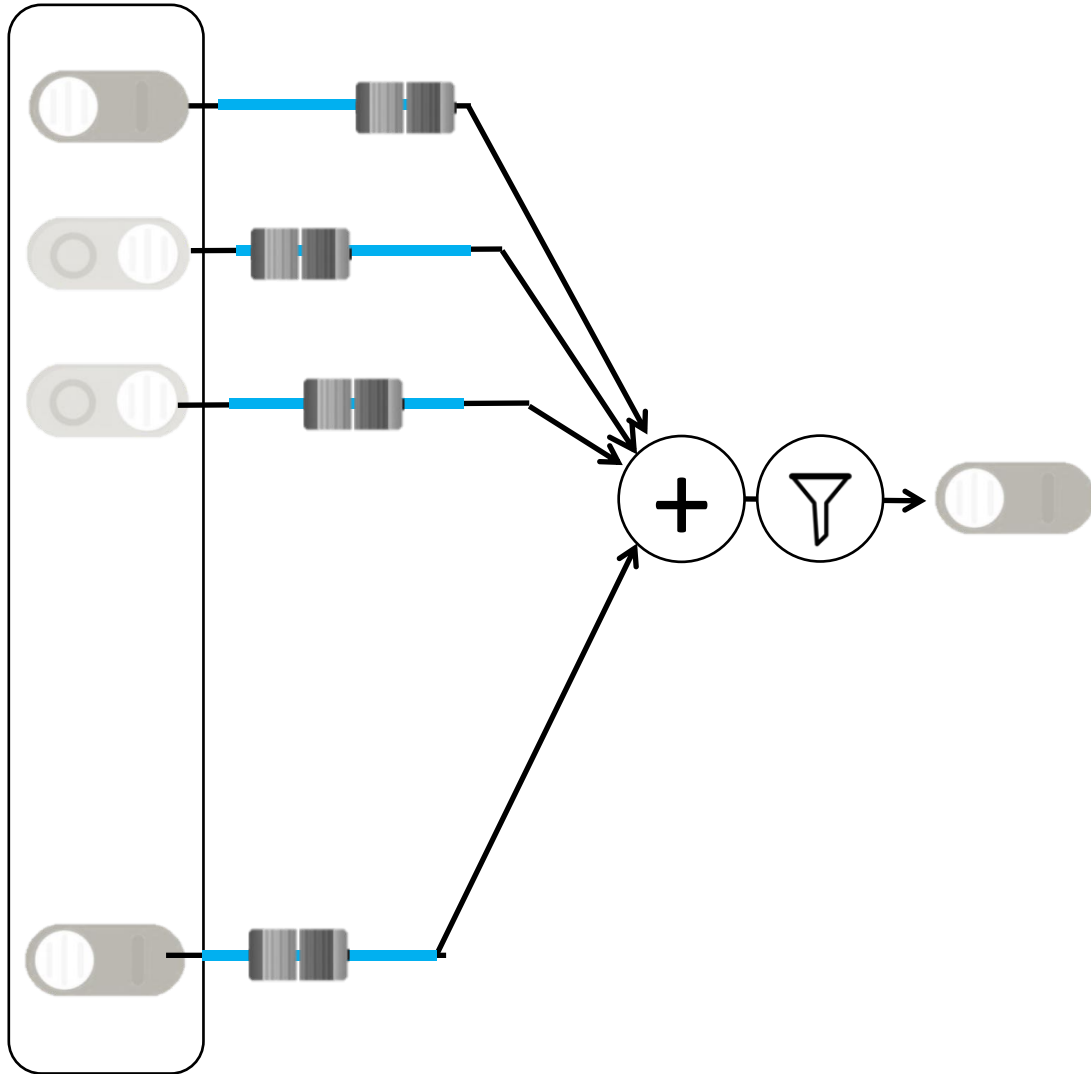
I think that is a picture of a **One!**

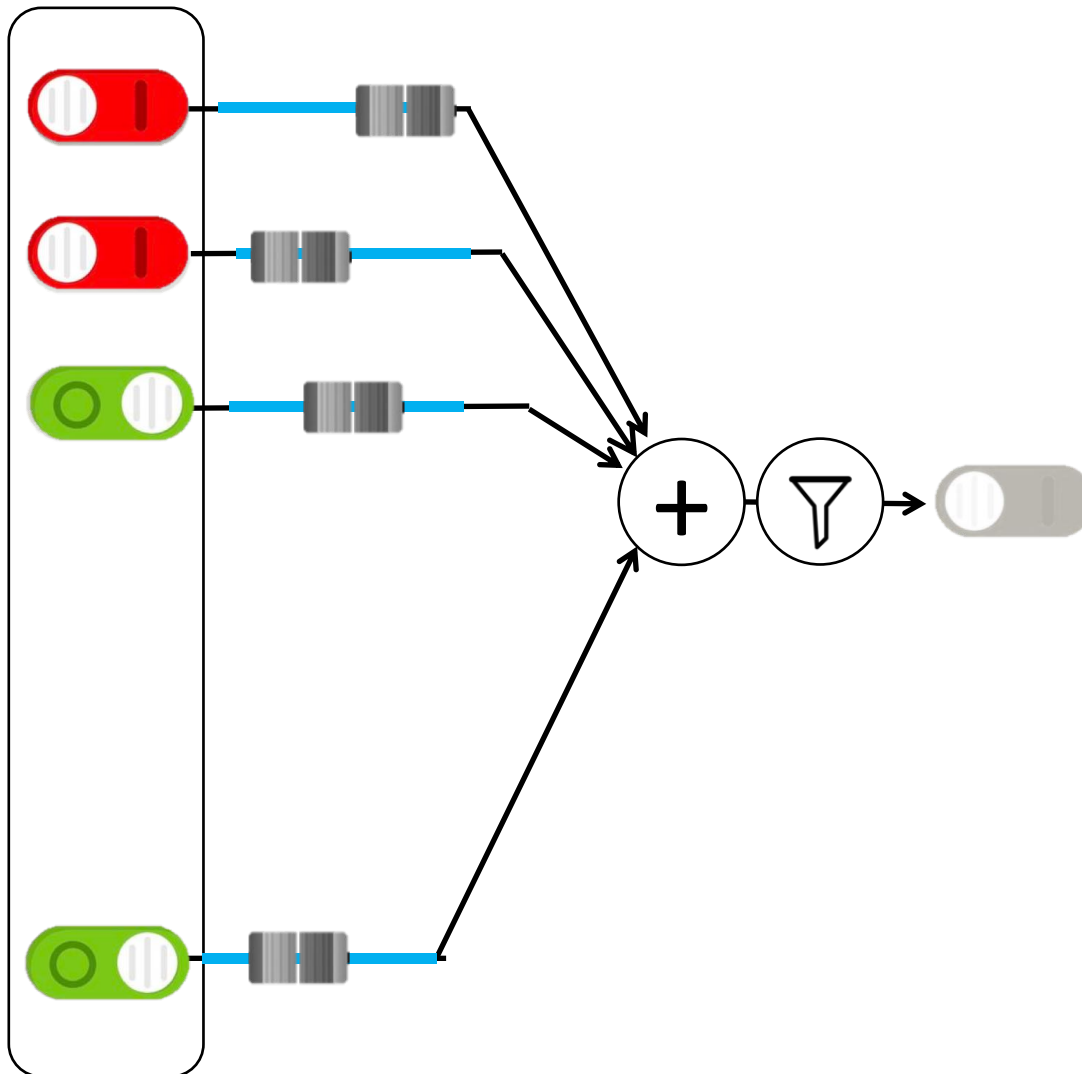
What do you mean it's actually a **Zero?**

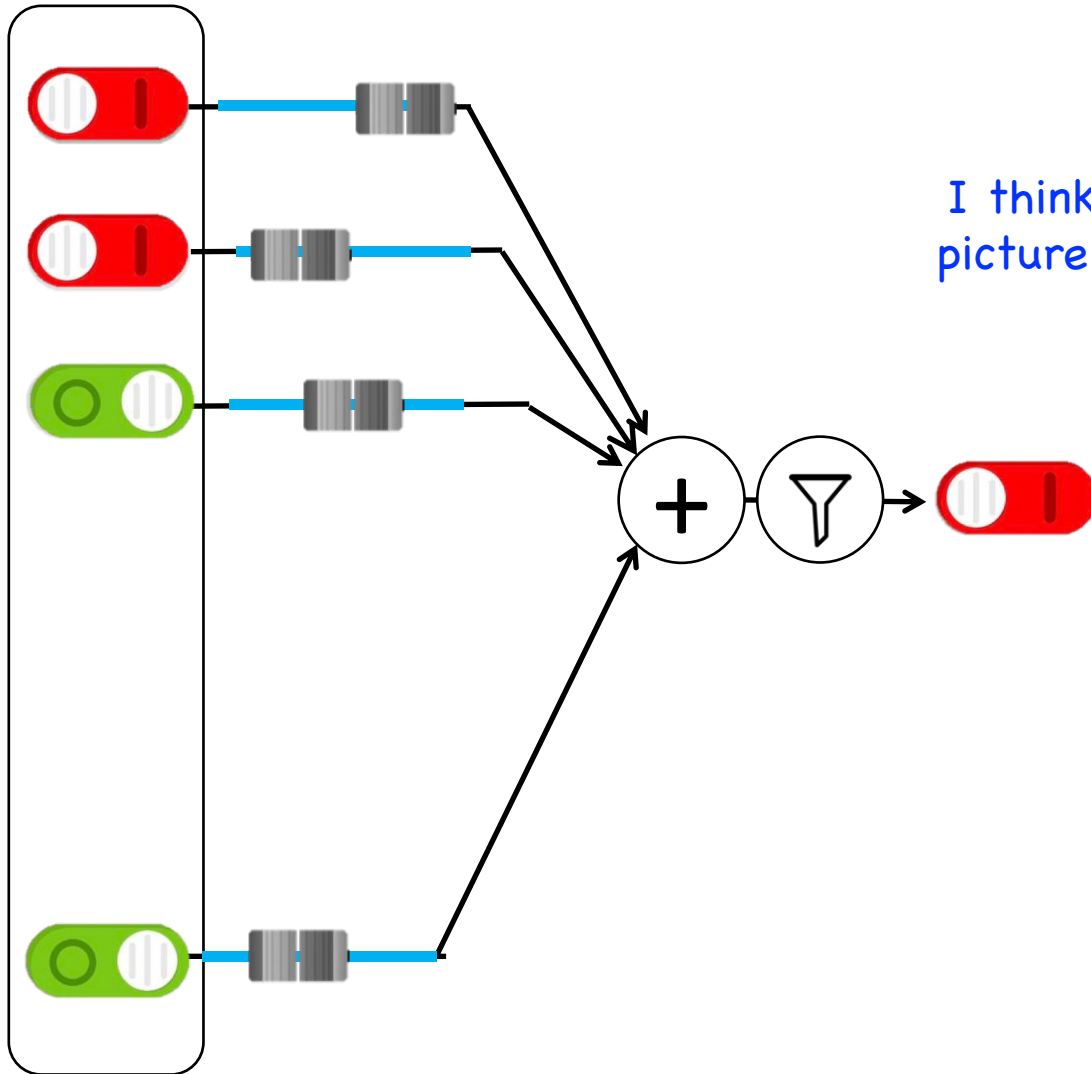
I'll adjust my sliders so that I do a better job in the future







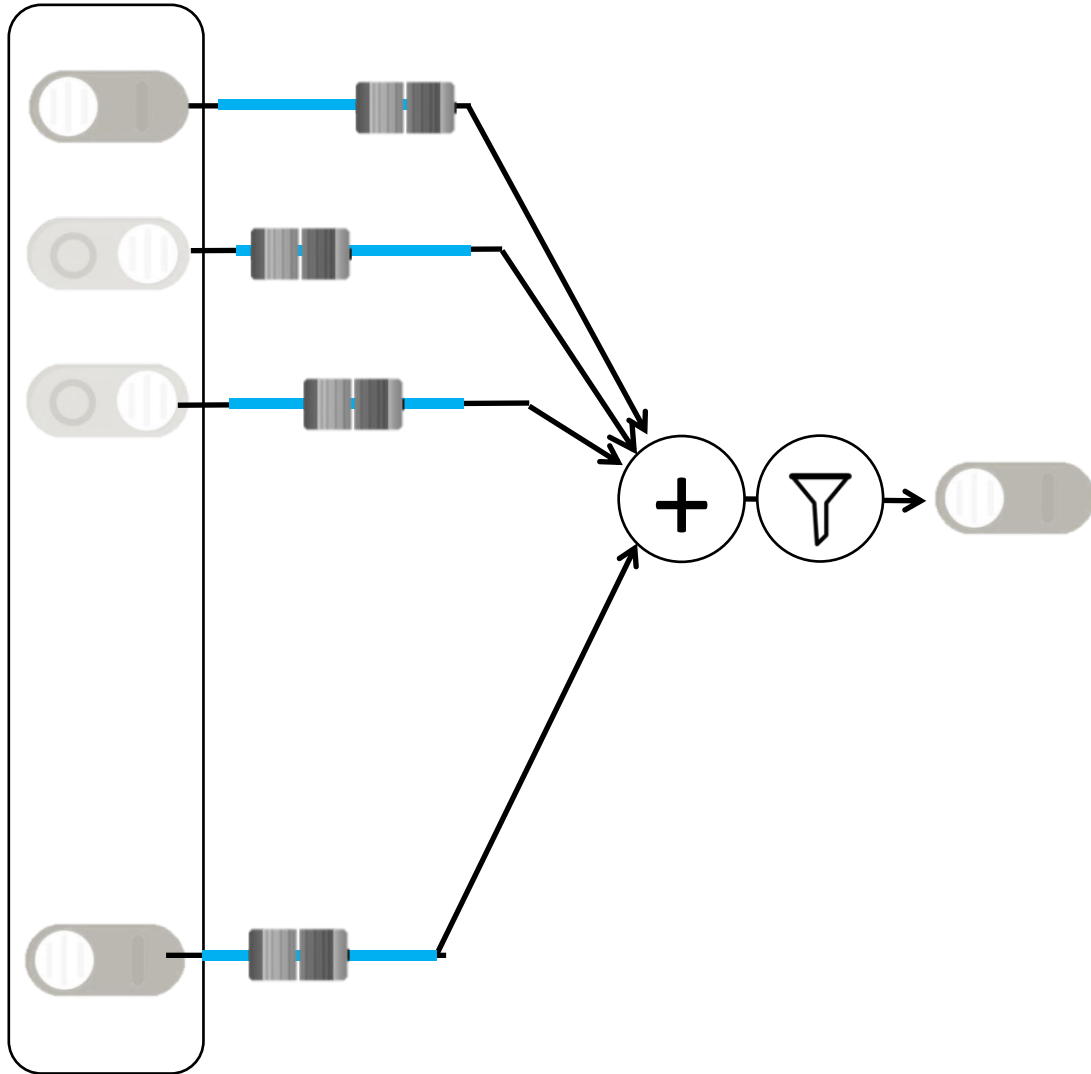


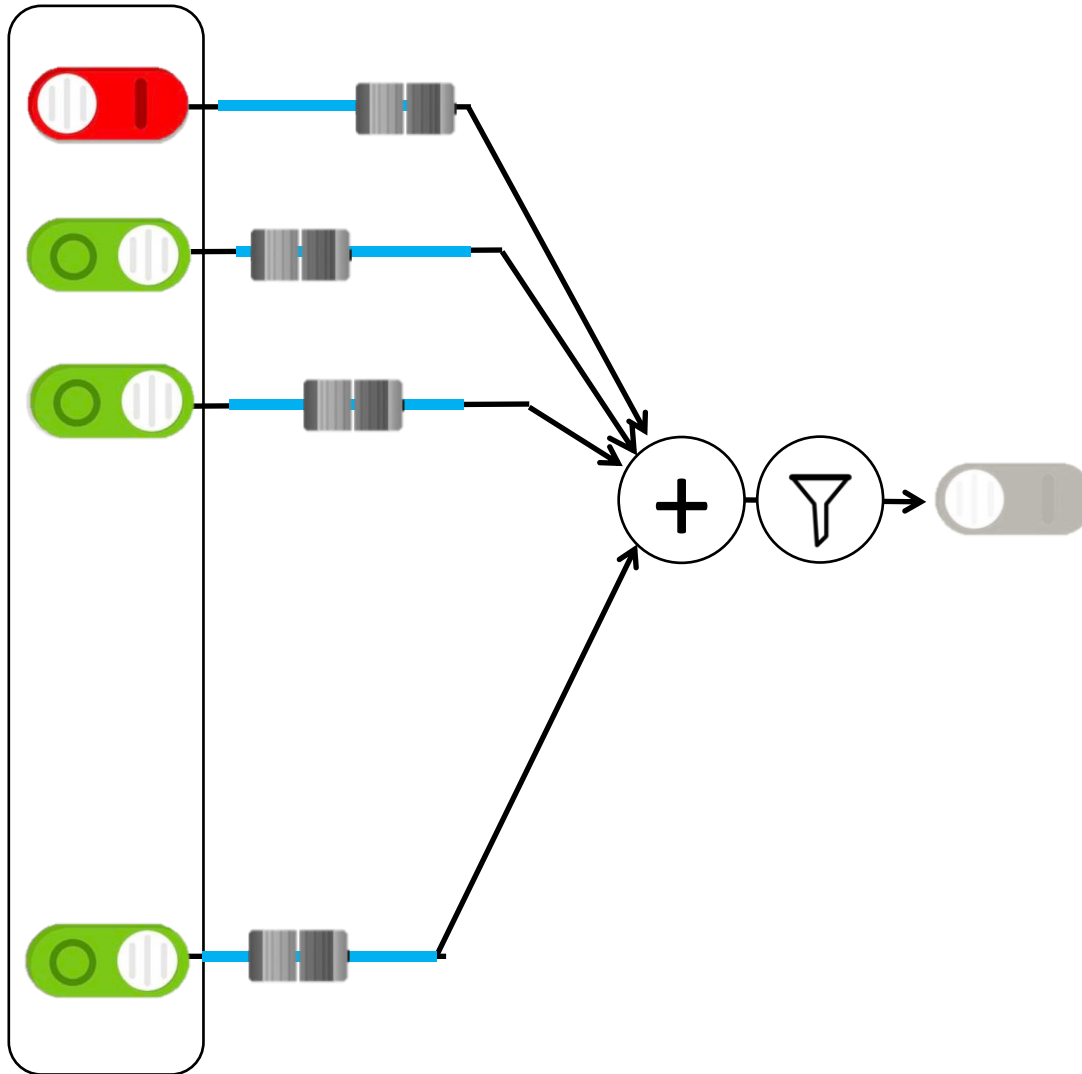


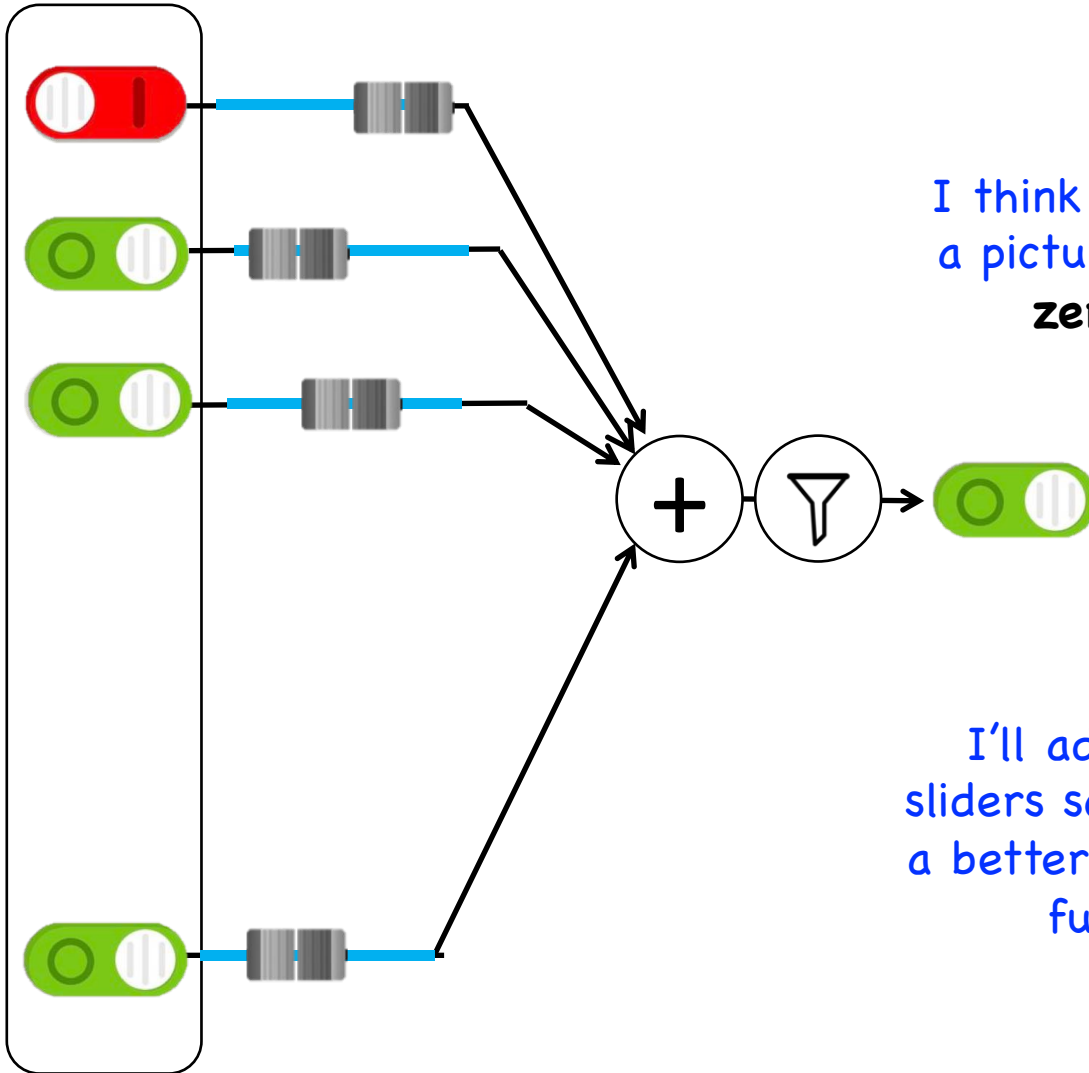
I think that is a picture of a **One!**

Wahoo I got it right!







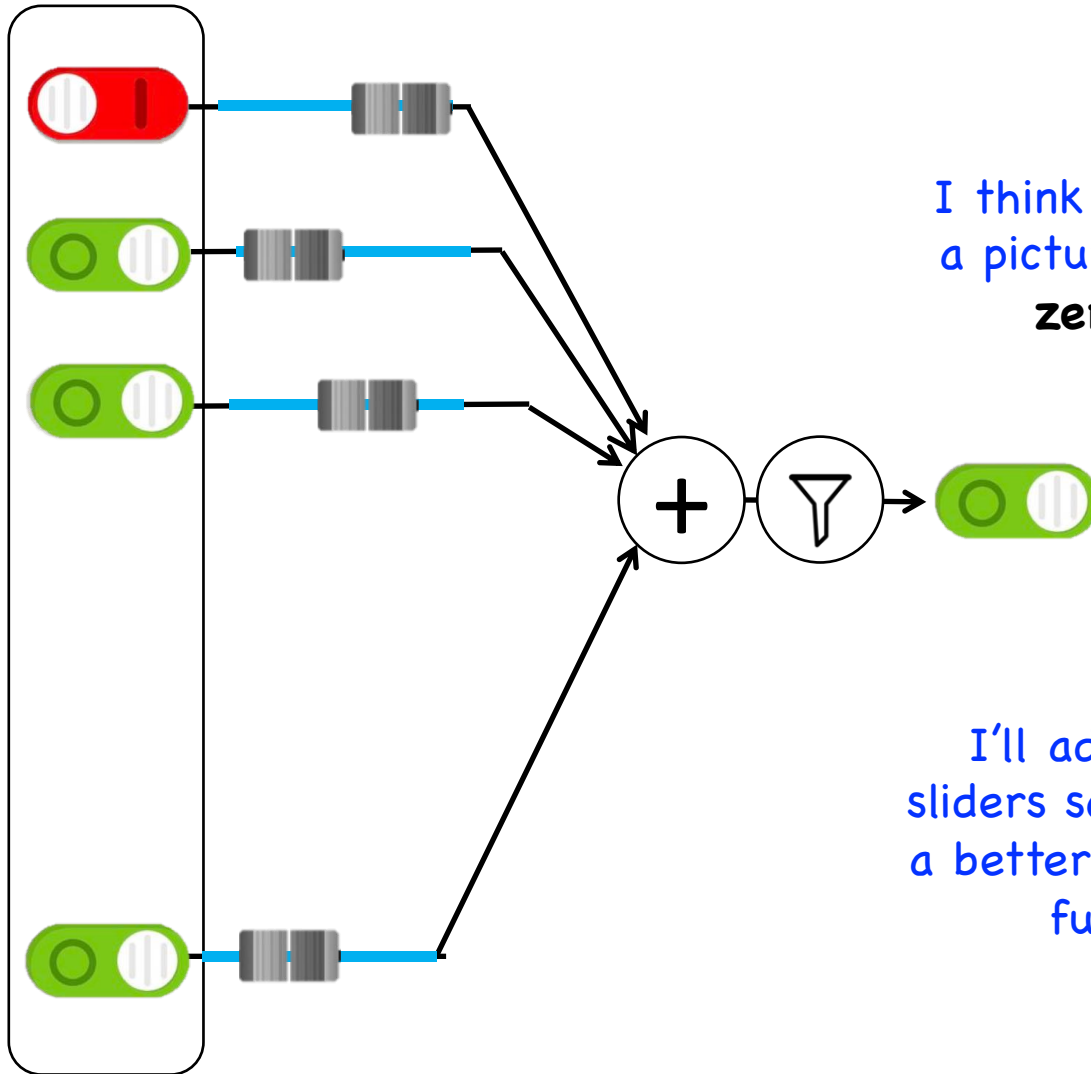


I think that is a picture of a **zero!**

What do you mean it's actually a **one?**

I'll adjust my sliders so that I do a better job in the future





I think that is
a picture of a
zero!

What do you
mean it's
actually a **one?**

I'll adjust my
sliders so that I do
a better job in the
future



Study Hard!



Visualize the Sliders



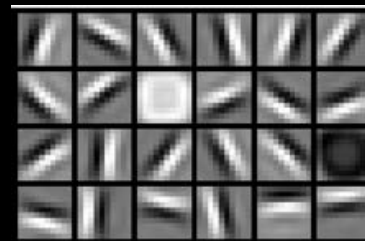
Training set: Aligned images of faces.



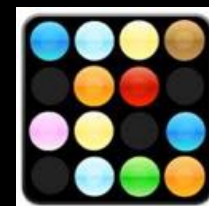
object models



object parts
(combination
of edges)



edges



pixels

Woah... that's like a brain...

True.

Decomposition

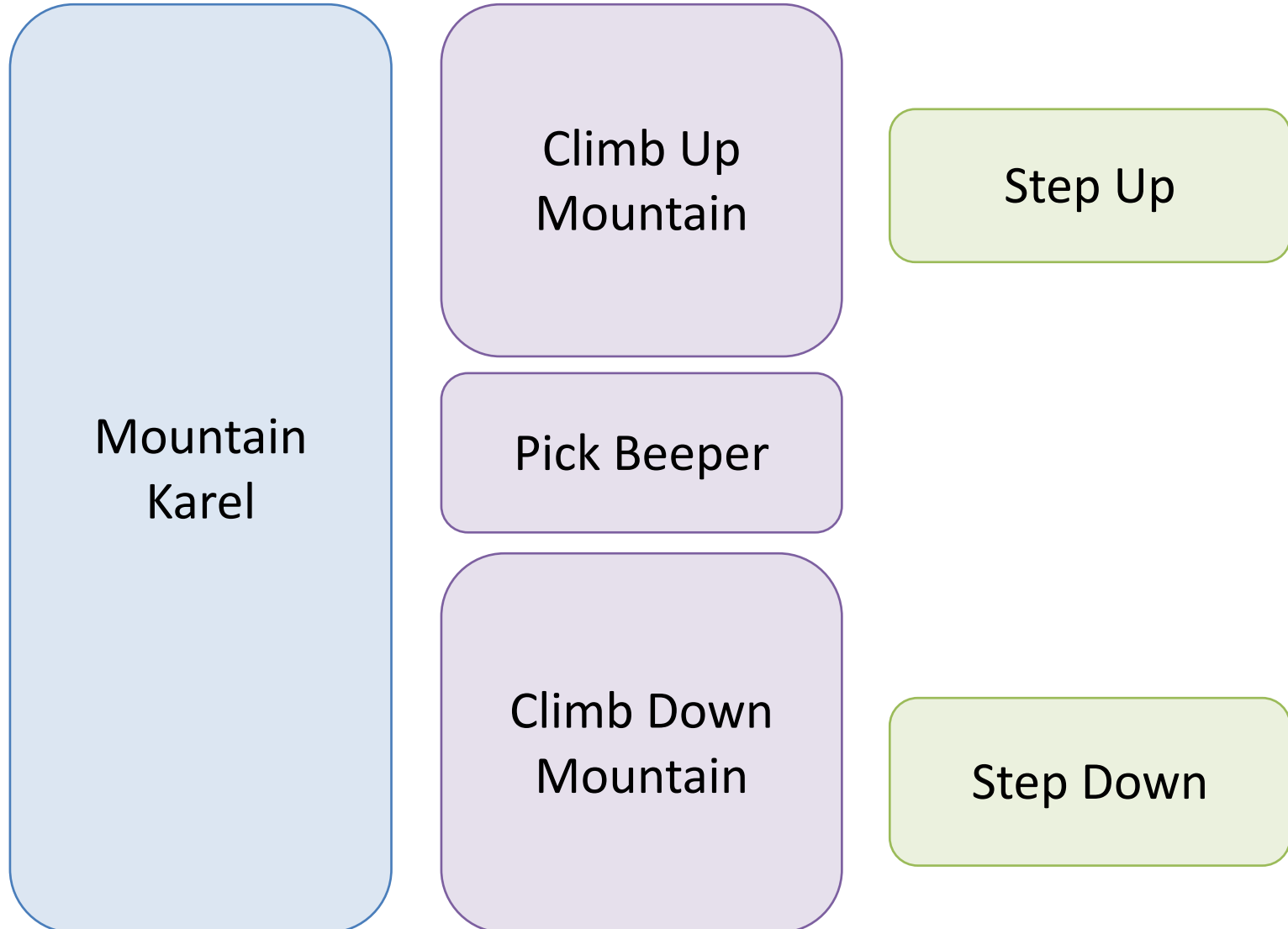


Image Net Classification

...

smoothhound, smoothhound shark, *Mustelus mustelus*

American smooth dogfish, *Mustelus canis*

Florida smoothhound, *Mustelus norrisi*

whitetip shark, reef whitetip shark, *Triaenodon obseus*

Atlantic spiny dogfish, *Squalus acanthias*

Pacific spiny dogfish, *Squalus suckleyi*

hammerhead, hammerhead shark

smooth hammerhead, *Sphyrna zygaena*

smalleye hammerhead, *Sphyrna tudes*

shovelhead, bonnethead, bonnet shark, *Sphyrna tiburo*

angel shark, angelfish, *Squatina squatina*, monkfish

electric ray, crampfish, numbfish, torpedo

smalltooth sawfish, *Pristis pectinatus*

guitarfish

rougtail stingray, *Dasyatis centroura*

butterfly ray

eagle ray

spotted eagle ray, spotted ray, *Aetobatus narinari*

cownose ray, cow-nosed ray, *Rhinoptera bonasus*

manta, manta ray, devilfish

Atlantic manta, *Manta birostris*

devil ray, *Mobula hypostoma*

grey skate, gray skate, *Raja batis*

little skate, *Raja erinacea*

...

Stingray



Mantaray



0.005%

Random guess

1.5%

Pre Neural Networks

?

GoogLeNet

0.005%

Random guess

1.5%

Pre Neural Networks

43.9%

GoogLeNet

0.005%

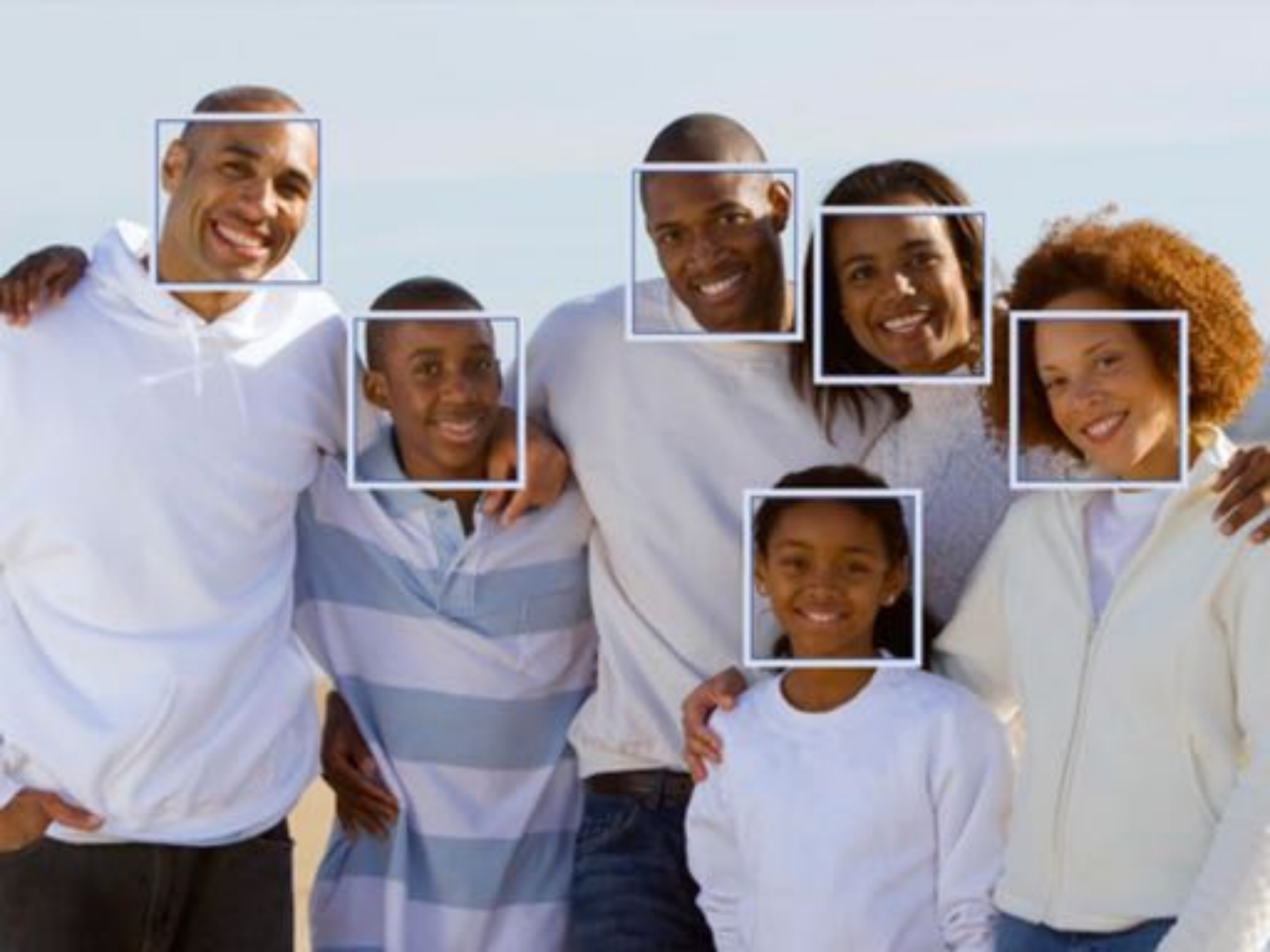
Random guess

1.5%

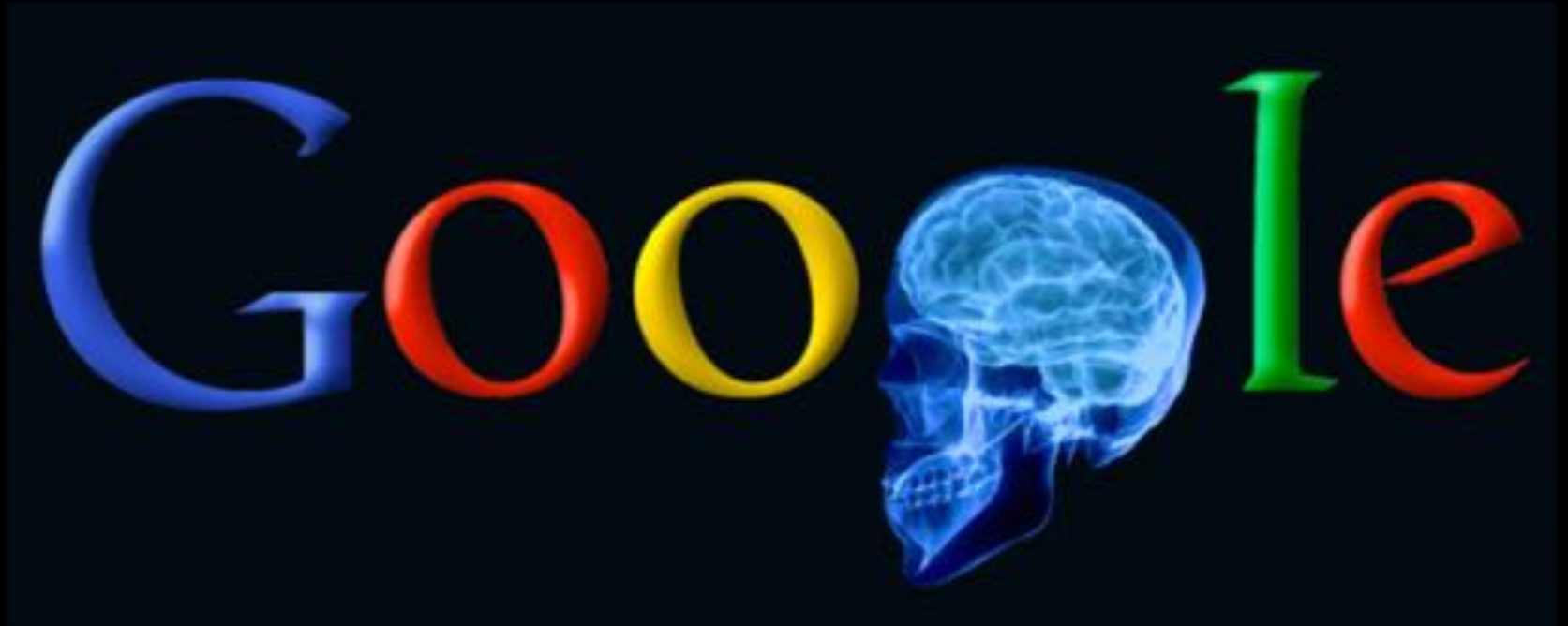
Pre Neural Networks

66.3%

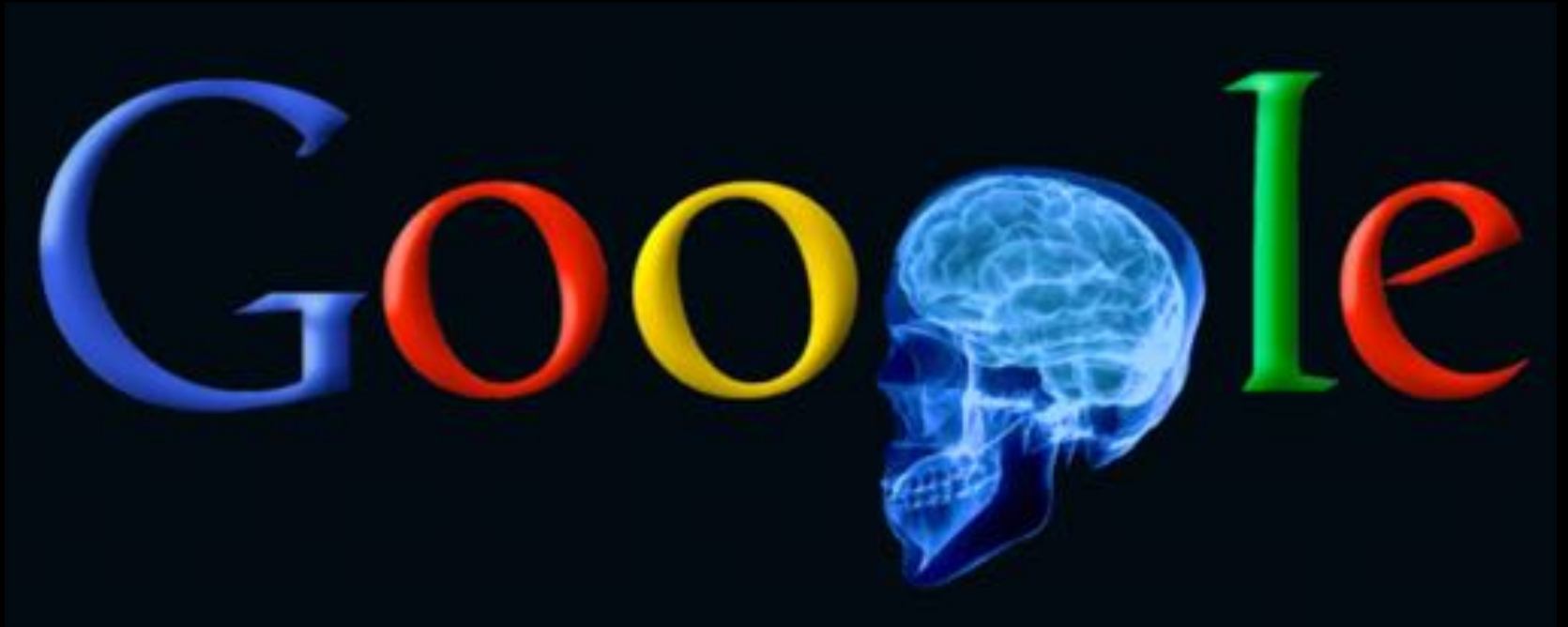
2016



Google Brain



Google Brain



1 Trillion Artificial Neurons

A Neuron That Fires When It Sees Cats



Top stimuli from the test set



Optimal stimulus
by numerical optimization

**HIRE THE SMARTEST PEOPLE IN THE
WORLD**



INVENT CAT DETECTOR

memegenerator.net

Other Neurons

Neuron 1



Neuron 2



Neuron 3



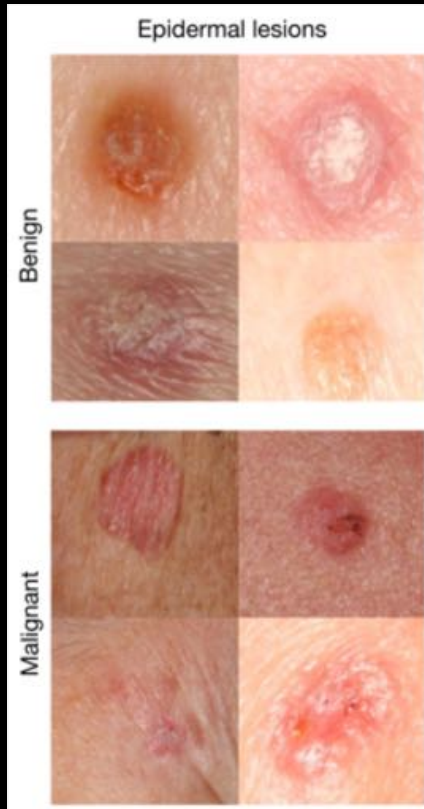
Neuron 4



Neuron 5



It can be useful



An algorithm learned to detect skin cancer from photo, better than the worlds top expert.

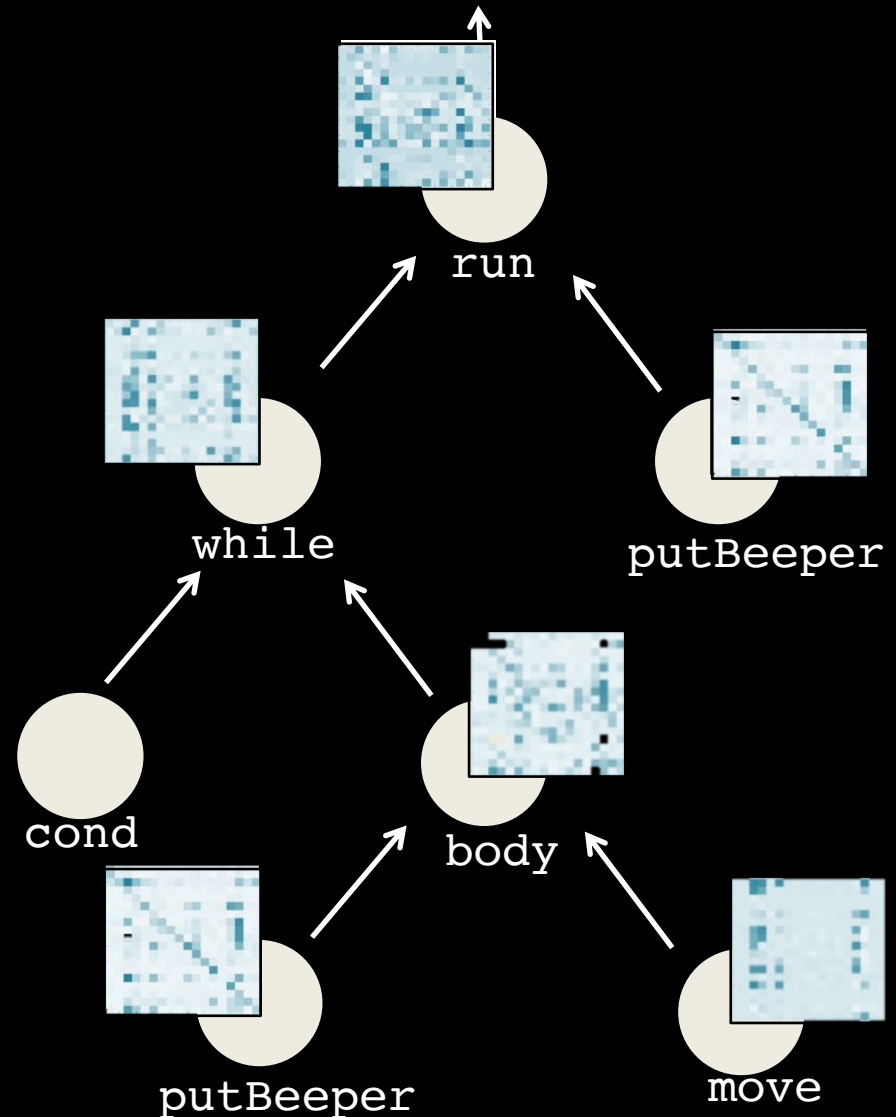
Developed last year

Esteva, Andre, et al. "Dermatologist-level classification of skin cancer with deep neural networks." *Nature* 542.7639 (2017): 115-118.

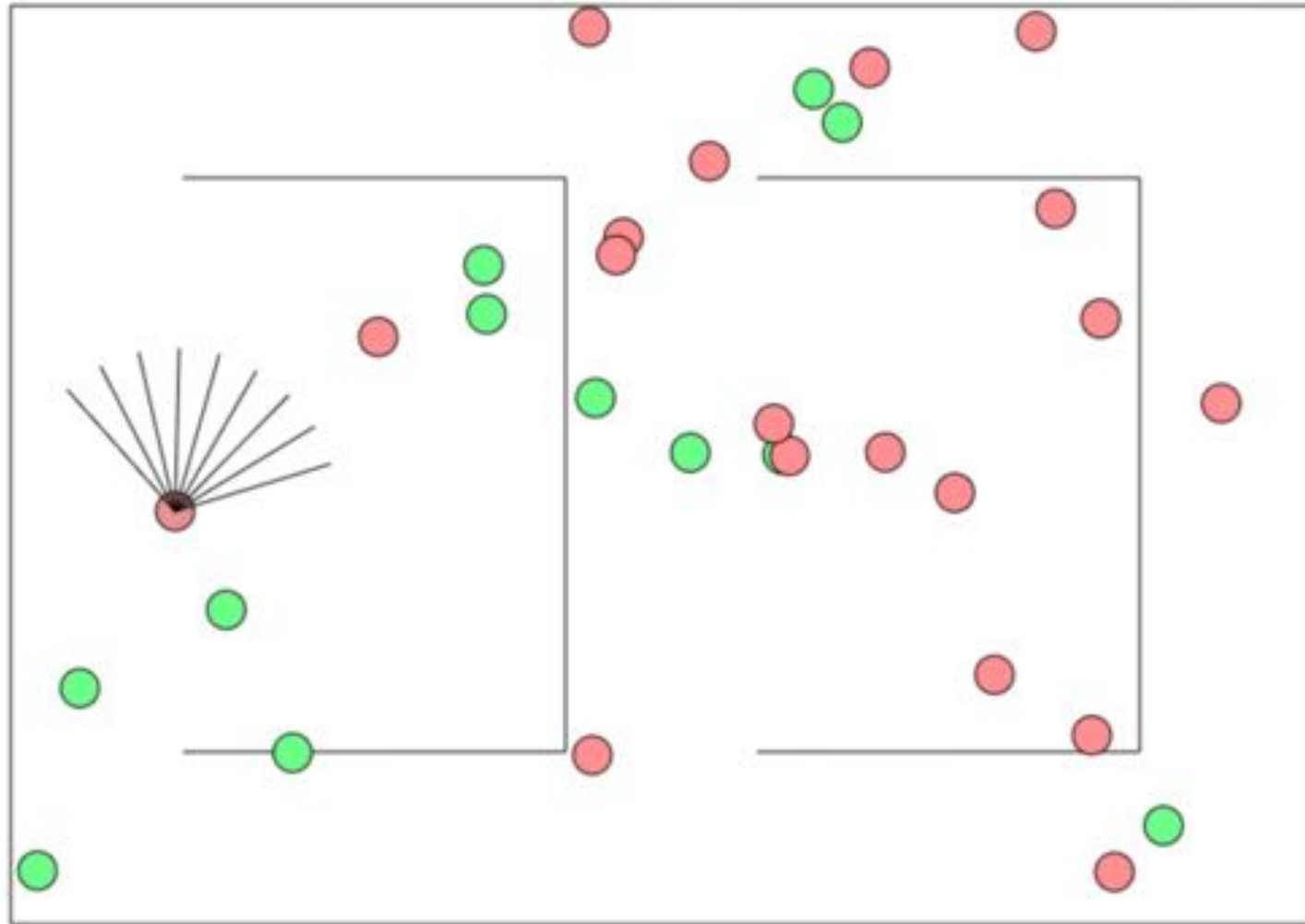
Helping Students Learn to Program

It looks like you have a fencepost error!

```
// User defined method
private void run() {
    while(isClear()){
        putBeeper();
        move();
    }
    putBeeper();
}
```



Beyond Harry Potter Hats



<http://cs.stanford.edu/people/karpathy/convnetjs/demo/rldemo.html>



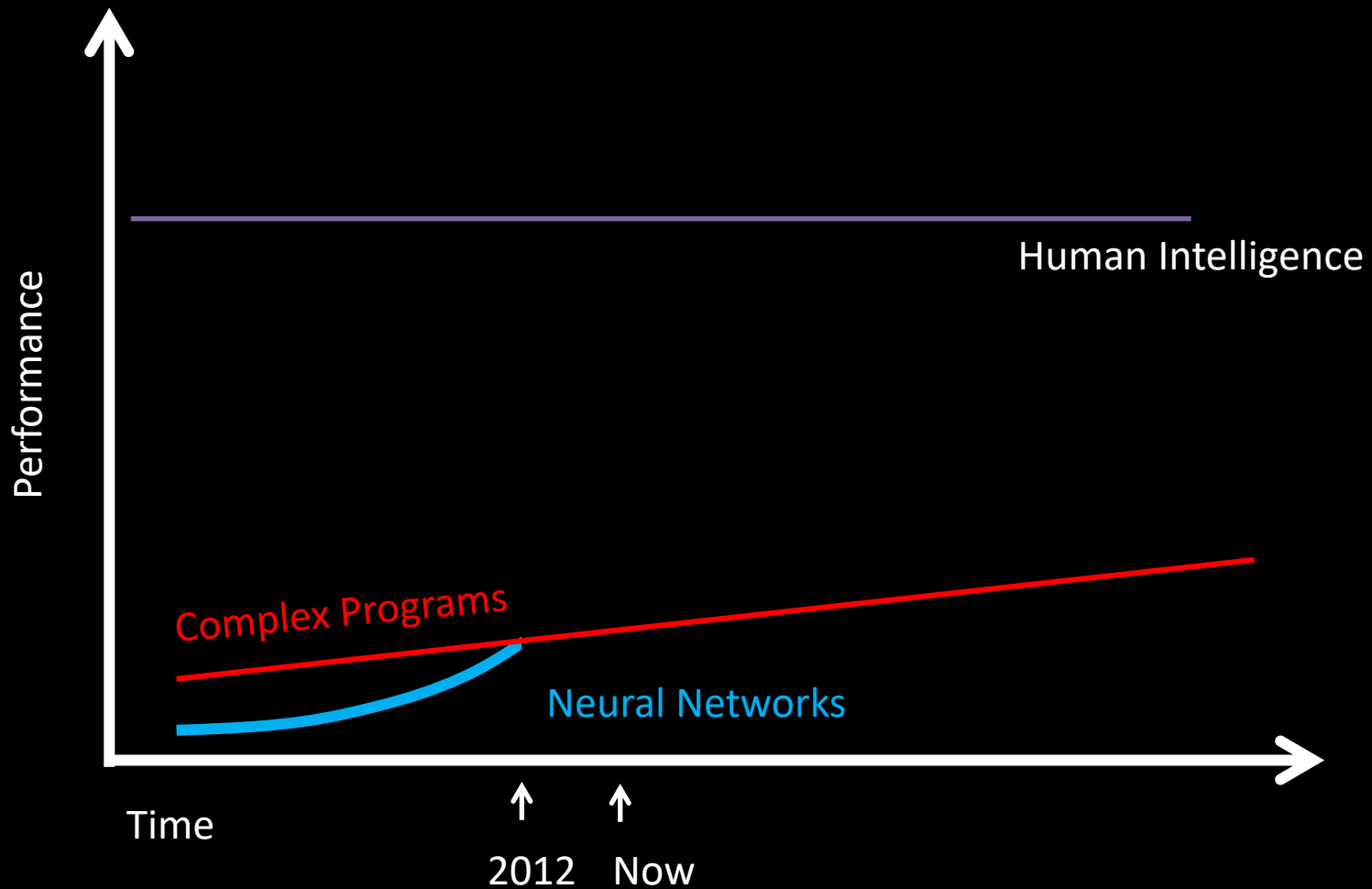
más allá de la clasificación

Starting out - 10 minutes of training

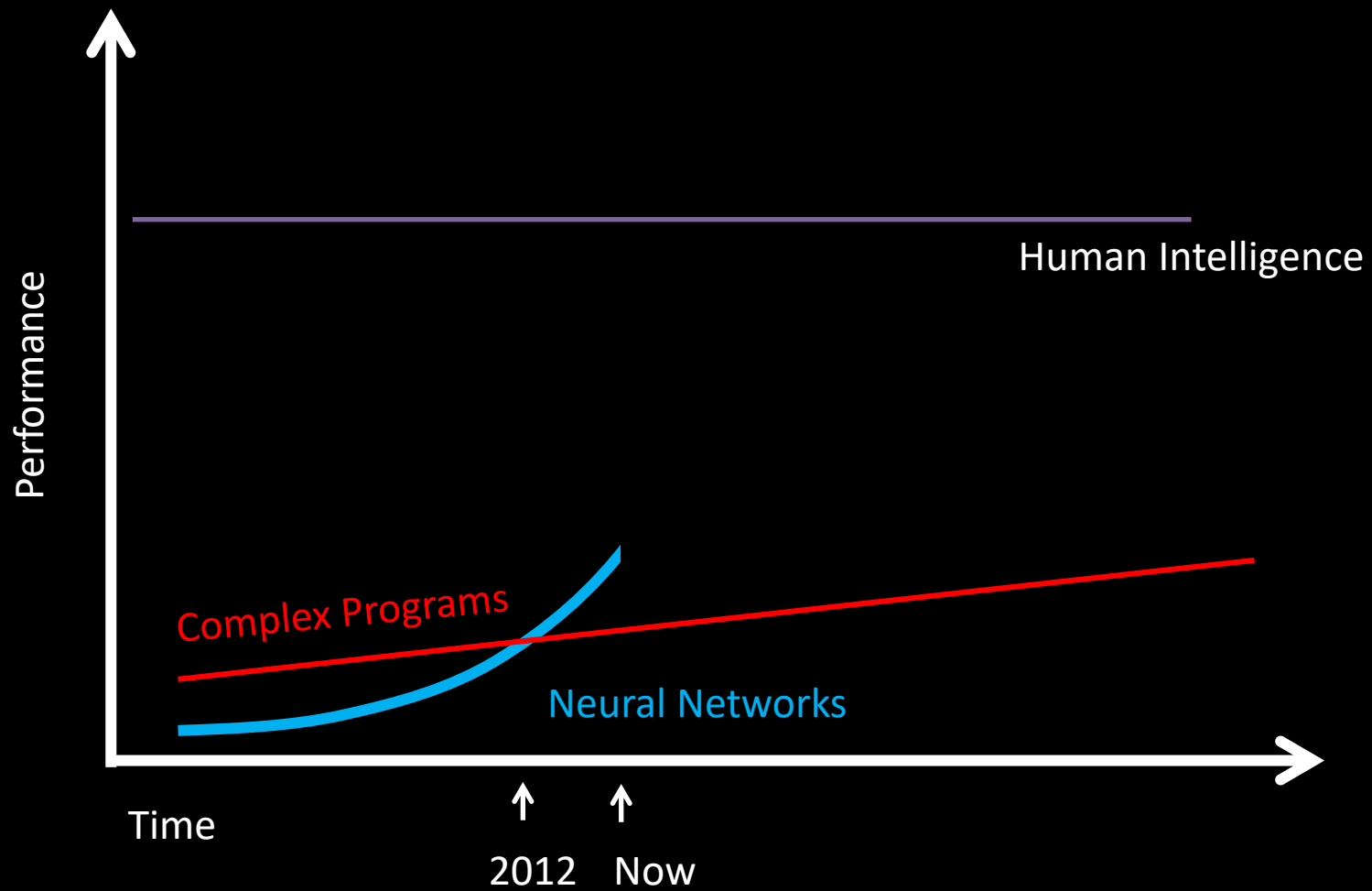
**The algorithm tries to hit the ball back, but
it is yet too clumsy to manage.**



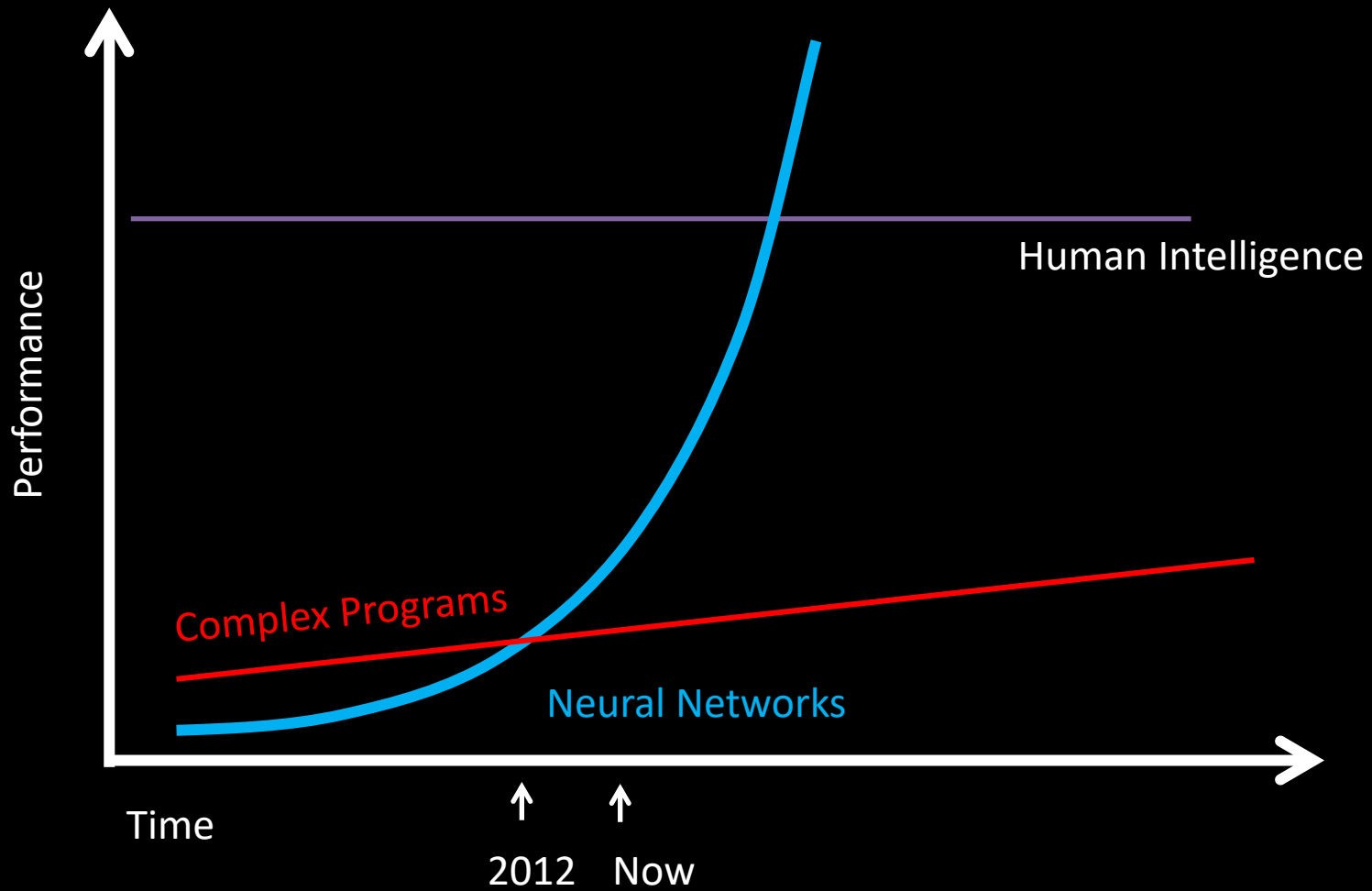
The Future of AI



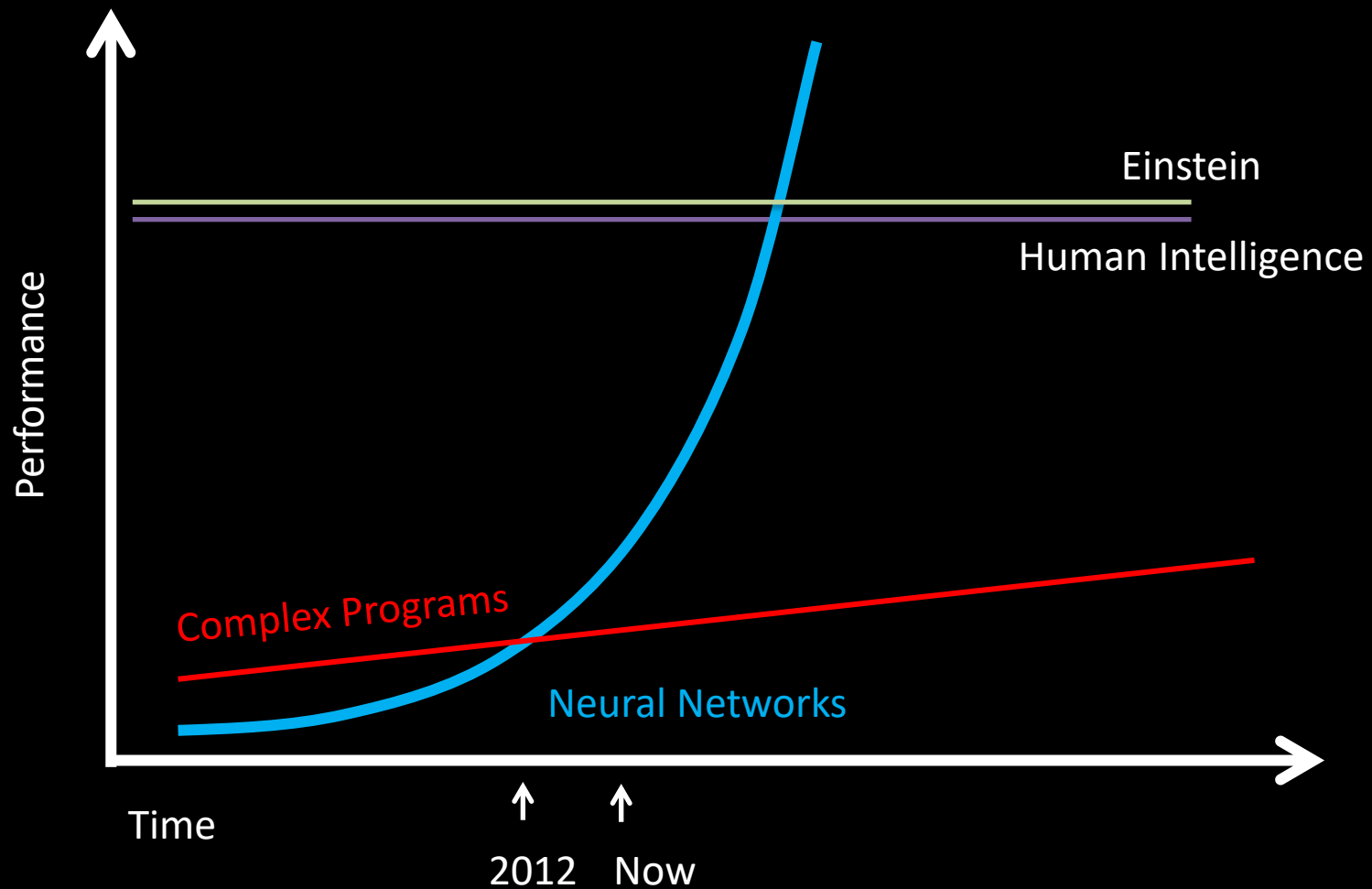
The Future of AI



The Future of AI



The Future of AI



Open Problems?

Machine Learning Uses a Lot of Data



One Shot Learning

Single training example:

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Test set:

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One Shot Learning

Single
training
example:



Where is my robot?

... coming soon

Should I study AI?

Powerful technology



Now is an amazing time



Know It So You Can Beat It



Little math



Todos son bienvenidos

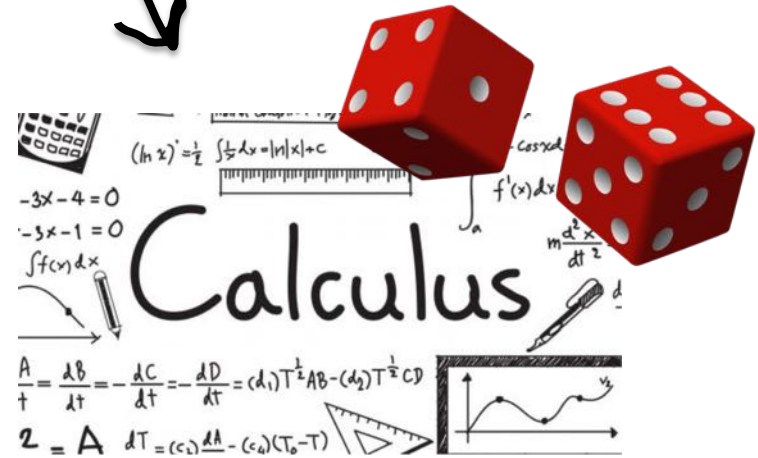


Road towards AI



DL4J

Libraries to use AI



Mathematics to invent AI



Next Step:



```
Nimm
There are 20 stones left
Player 1 would you like to remove 1 or 2 stones? 2
There are 18 stones left
Player 2 would you like to remove 1 or 2 stones? 2
There are 16 stones left
Player 1 would you like to remove 1 or 2 stones? 1
There are 15 stones left
Player 2 would you like to remove 1 or 2 stones? 2
...
Player 1 wins!
```





A black and white photograph of a spinning top toy. The top is a dark, teardrop-shaped object with a sharp point at the top and a wider, rounded base. It is positioned on a highly reflective surface, which creates a clear, inverted reflection of the top. The background is a soft, out-of-focus gradient of light and dark tones, suggesting an indoor setting with natural light. Overlaid on the right side of the image is the text "The End?" in a clean, white, sans-serif font.

The End?