



Beyond CS106A

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There is something going on
in the world of AI

[suspense]

Self Driving Cars



Computers Making Art



The Last Remaining Board Game

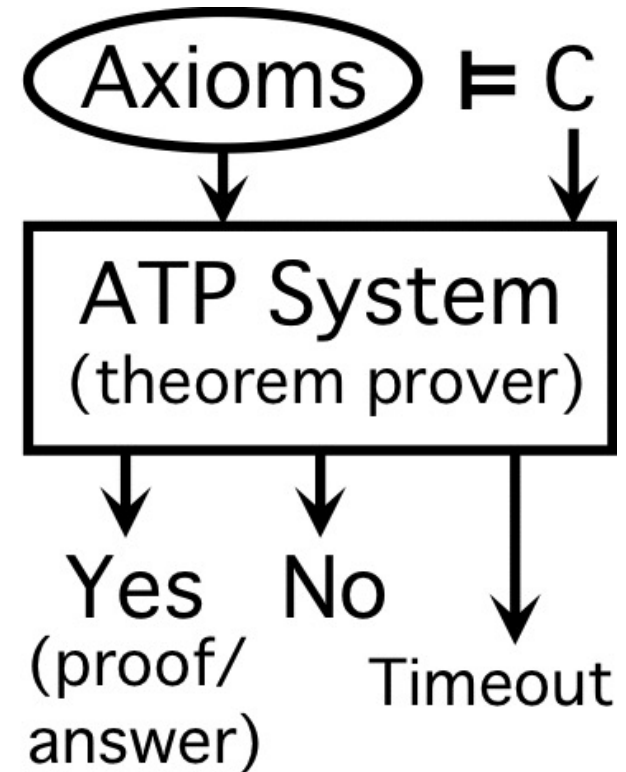


Early Optimism 1950

1952



1955



Computer Vision



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



Identifying Cats

Here's one way you might code this...

```
def is_cat(image):  
    if contains_two_eyes(image):  
        if has_whiskers(image):  
            if has_pointy_ears(image):  
                return True  
    return False
```



Identifying Cats

Here's one way you might code this...

```
def is_cat(image):  
    if not contains_two_eyes(image):  
        return False  
    if not has_whiskers(image):  
        return False  
    if not has_pointy_ears(image):  
        return False  
    return True
```

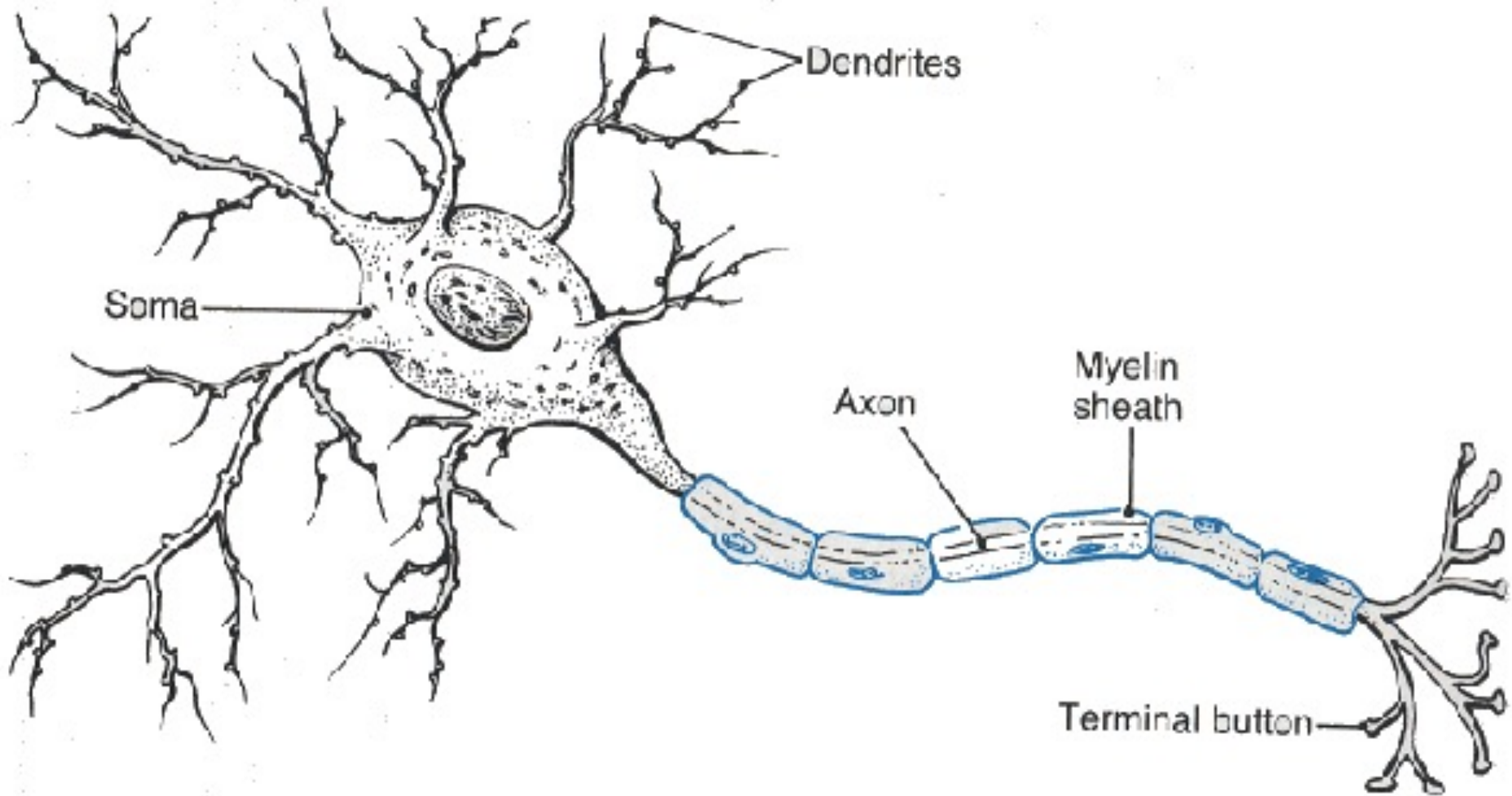


Some Tricky Cases

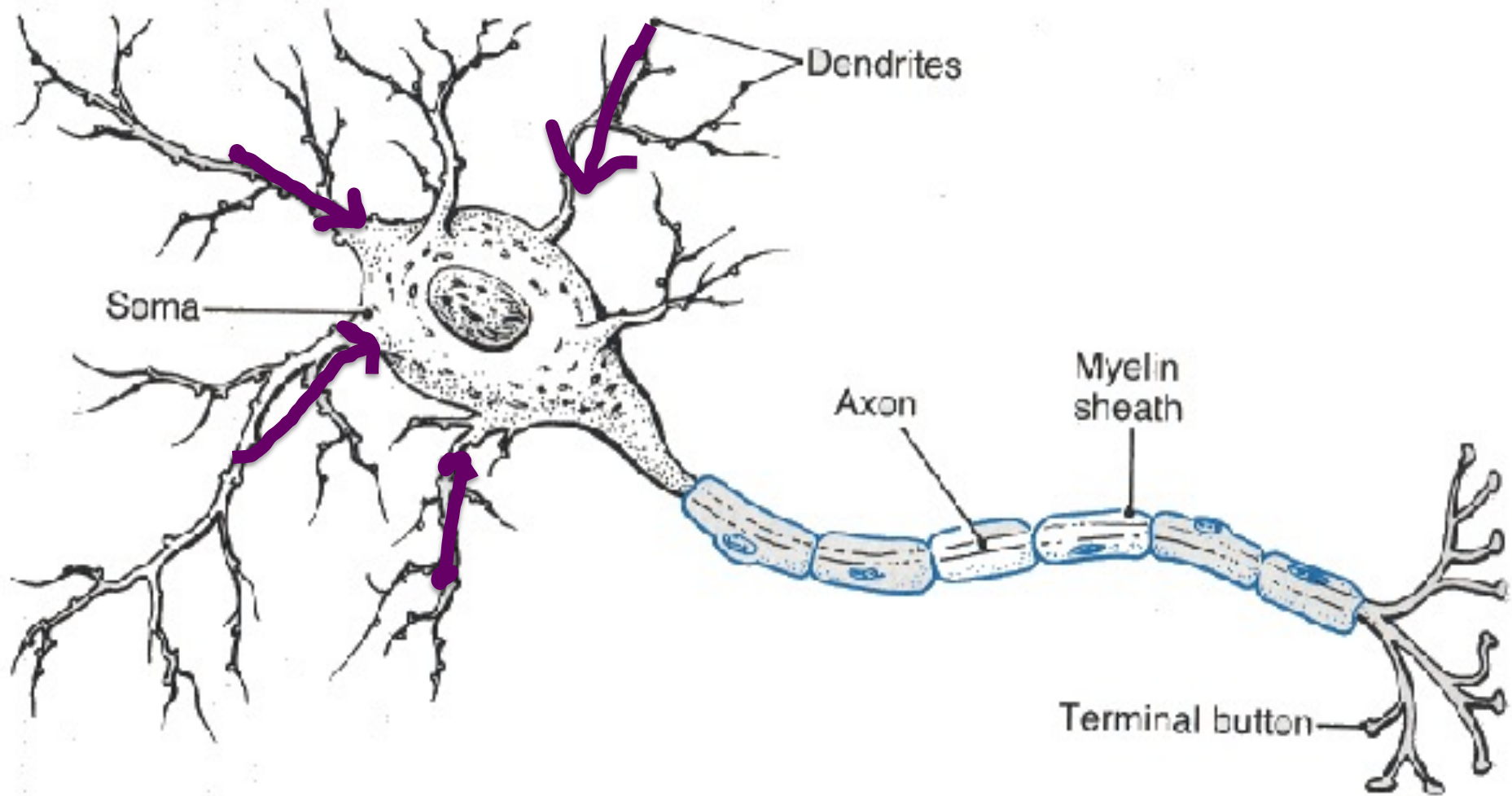


Great idea inspired by biology

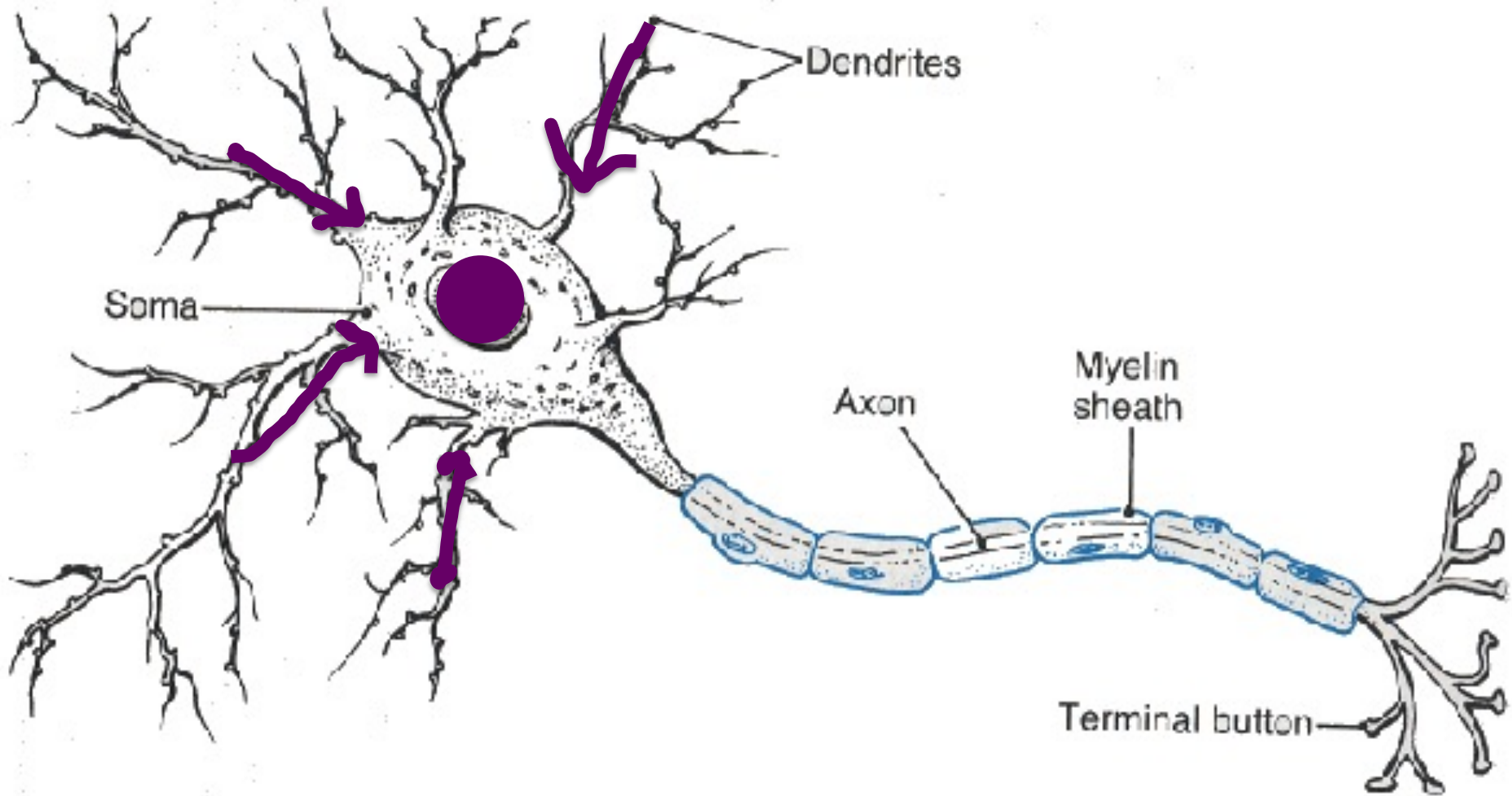
Neuron



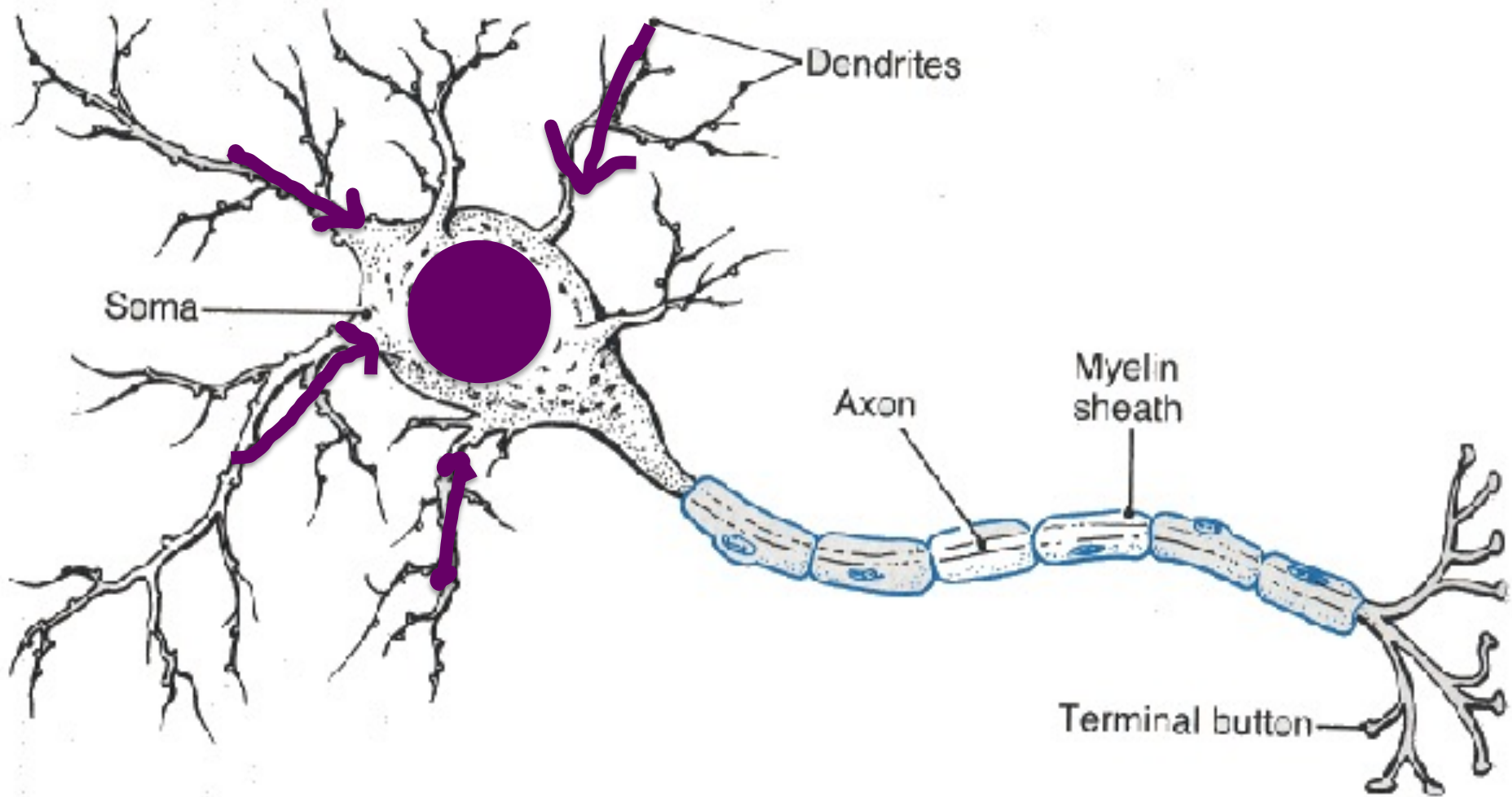
Neuron



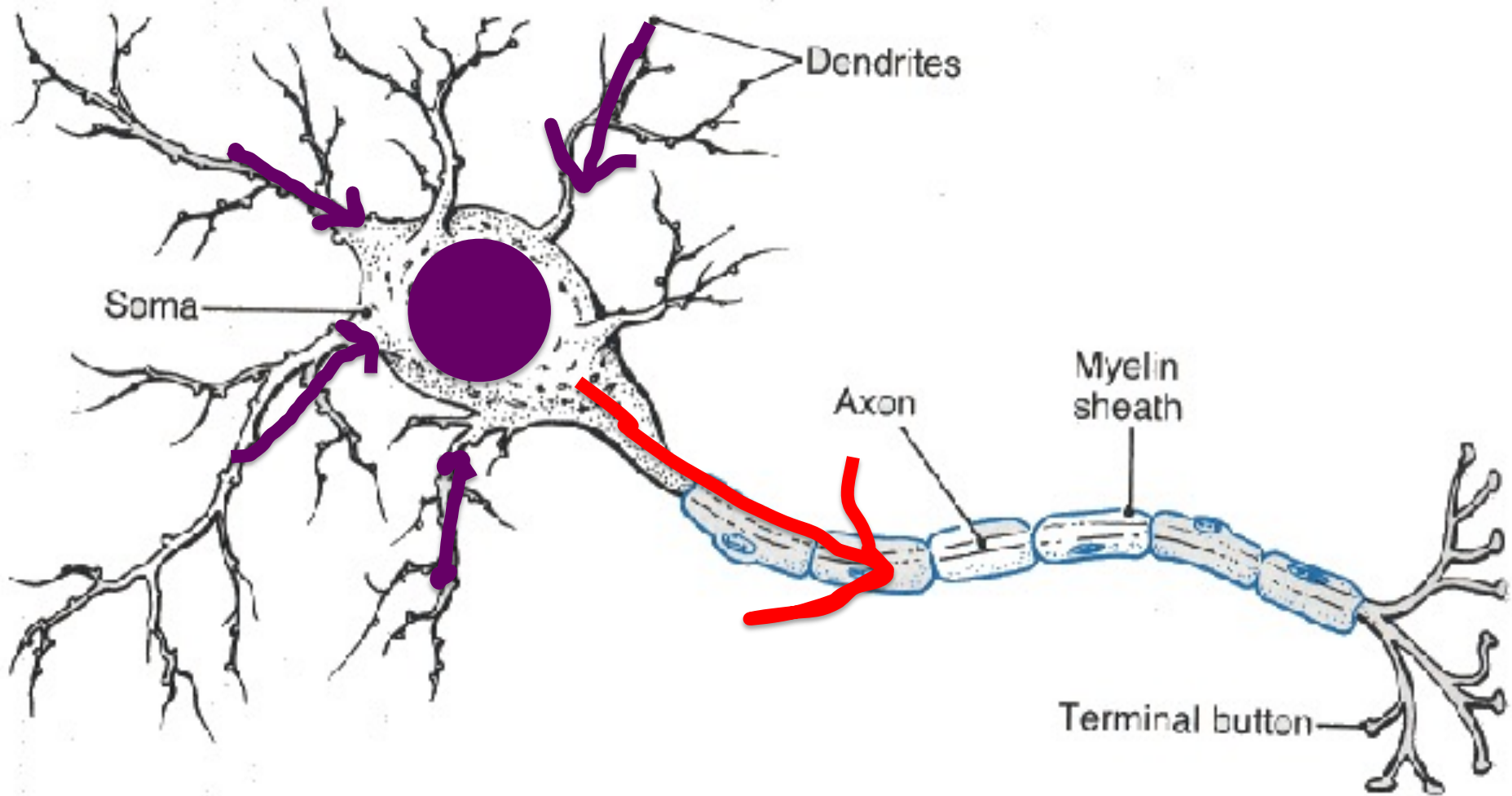
Neuron



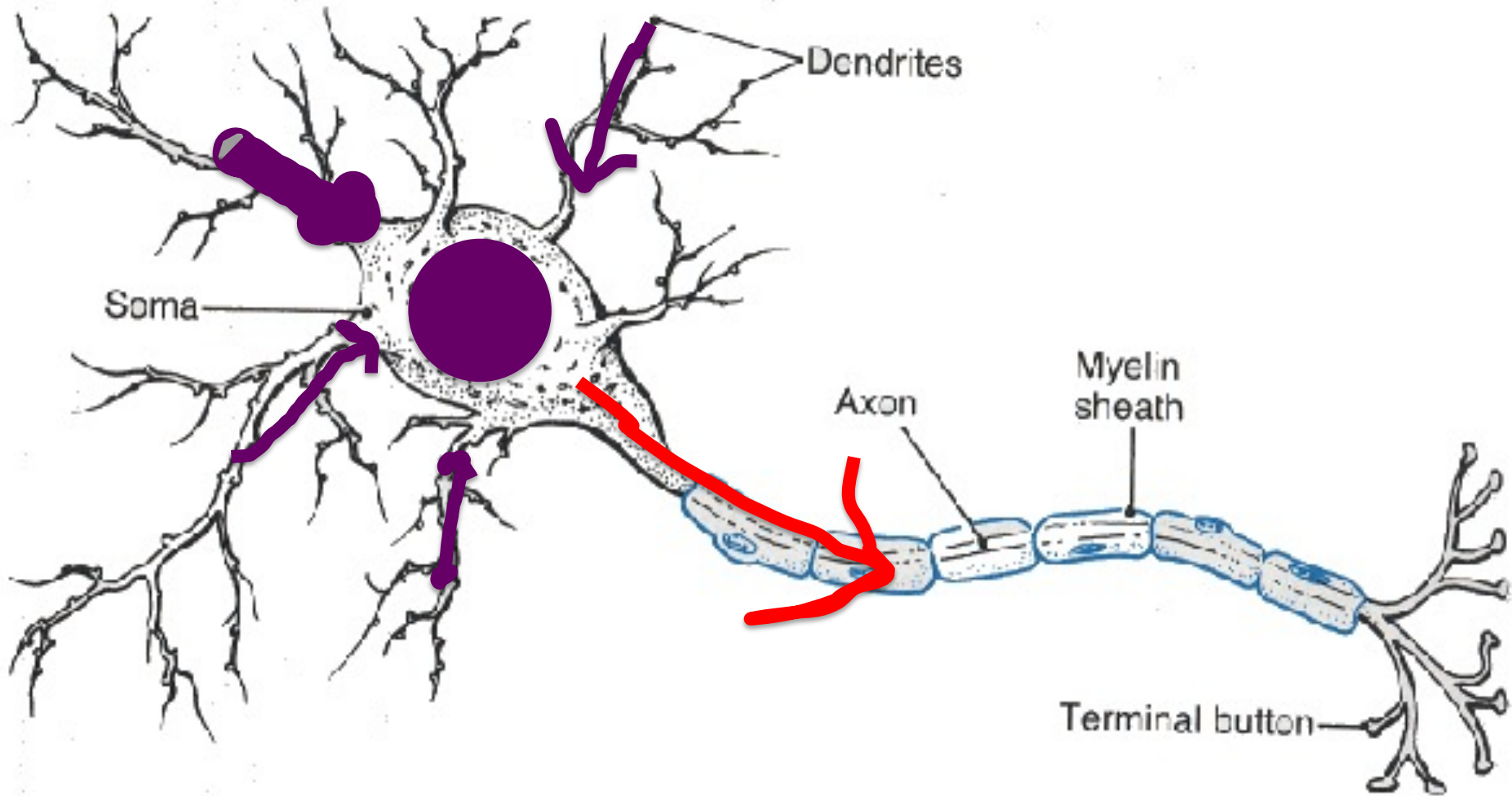
Neuron



Neuron



Some Inputs are More Important



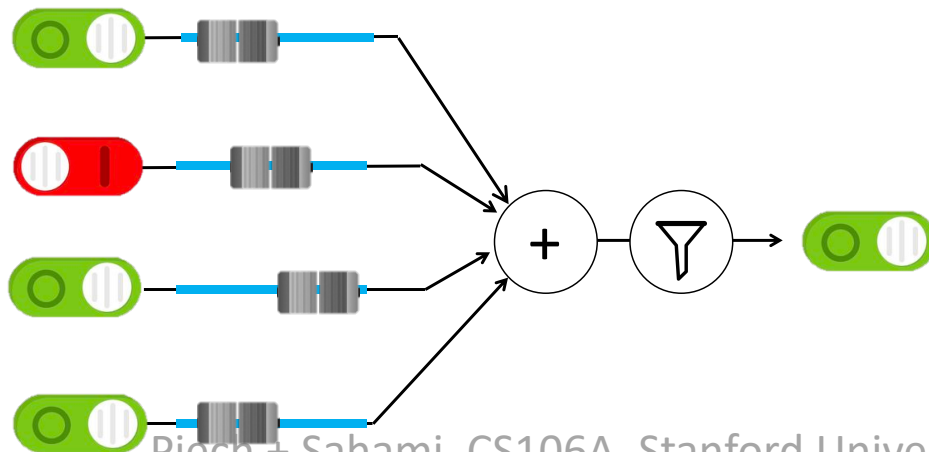
Artificial Neuron

calculate the activation of a neuron

```
def activate(weights_list, inputs_list):  
    n = len(inputs_list)  
    weighted_sum = 0  
    for i in range(n):  
        weighted_sum += weights_list[i] * inputs_list[i]  
  
    return squash(weighted_sum)
```

the sigmoid function forces a value to be between 0 and 1

```
def squash(value):  
    return 1 / (1 + math.exp(-value));
```



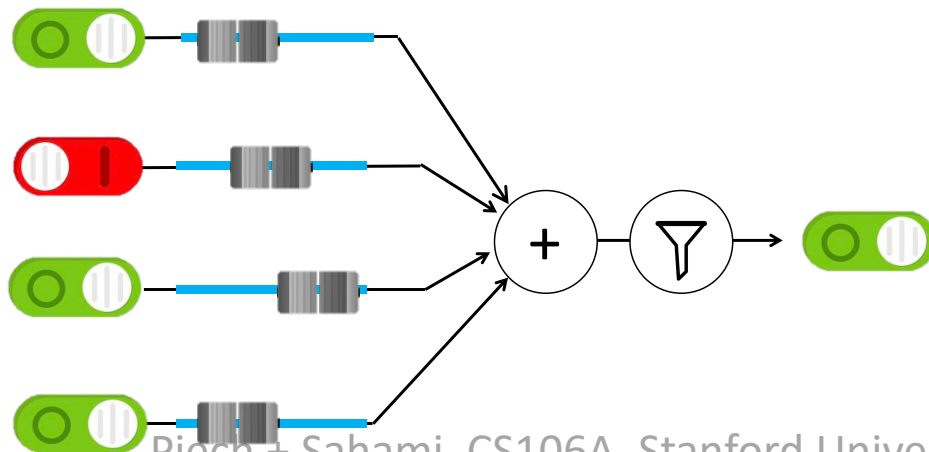
Artificial Neuron

calculate the activation of a neuron

```
def activate(weights_list, inputs_list):  
    n = len(inputs_list)  
    # using list comprehensions  
    weighted = [weights_list[i] * inputs_list[i] for i in range(n)]  
    weighted_sum = sum(weighted)  
    return squash(weighted_sum)
```

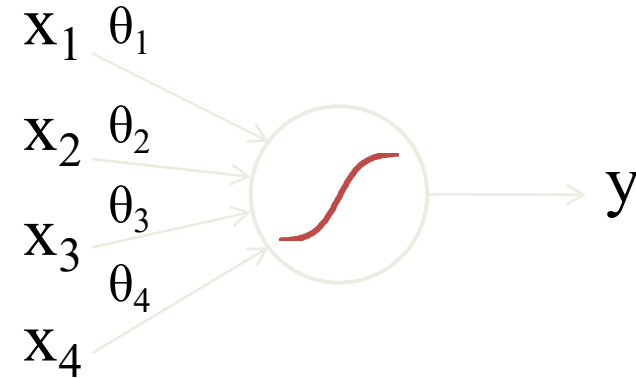
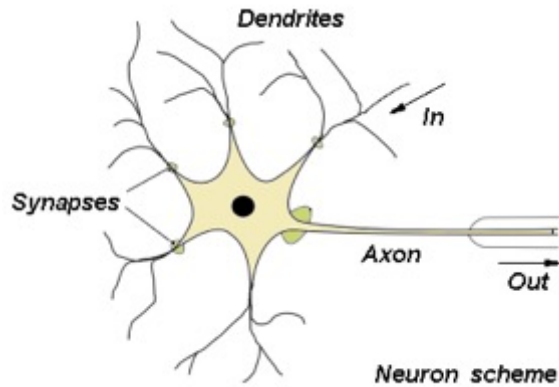
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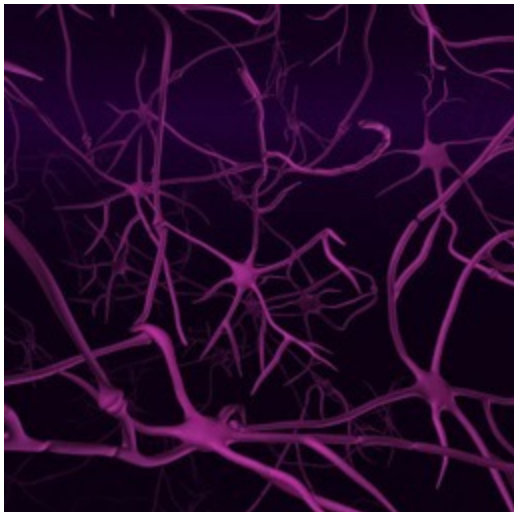


Biological Basis for Neural Networks

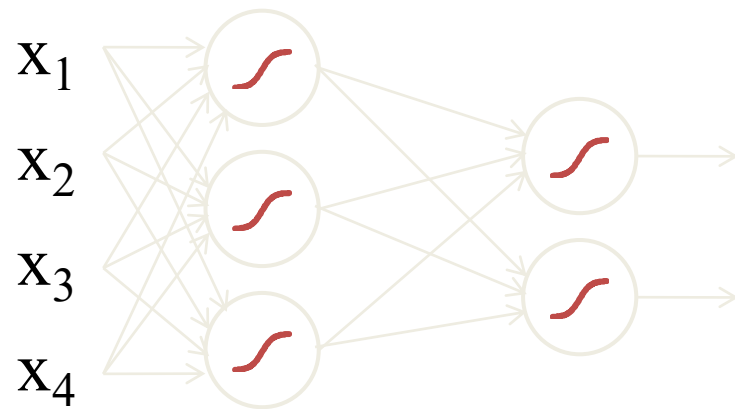
- A neuron



- Your brain



Actually, it's probably someone else's brain



Demonstration

Draw your number here



Downsampled drawing:

First guess:

Second guess:

Layer visibility

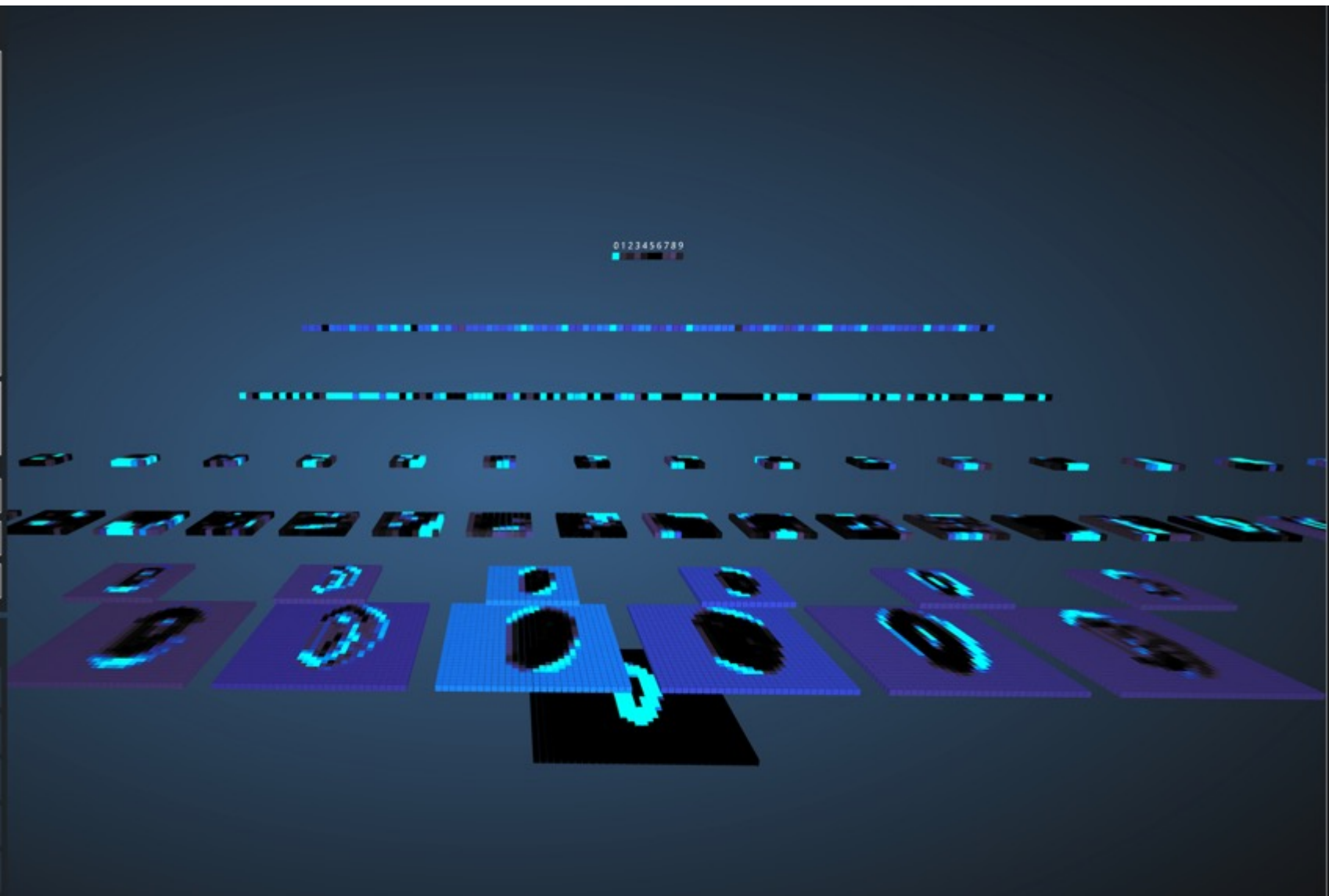
Input layer

Convolution layer 1

Downsampling layer 1

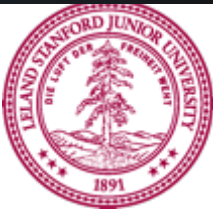
Convolution layer 2

Downsampling layer 2



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

Piech + Sahami, CS106A, Stanford University



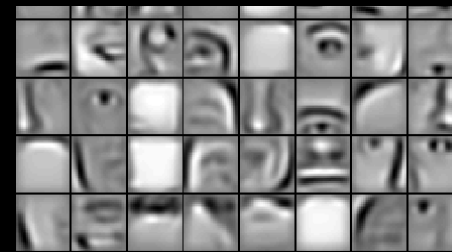
Visualize the Weights



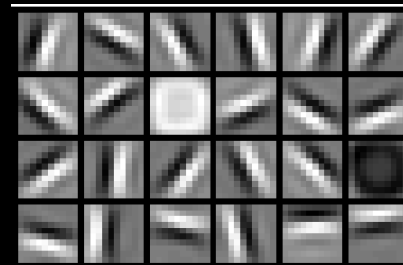
Training set: Aligned images of faces.



object models



object parts
(combination
of edges)

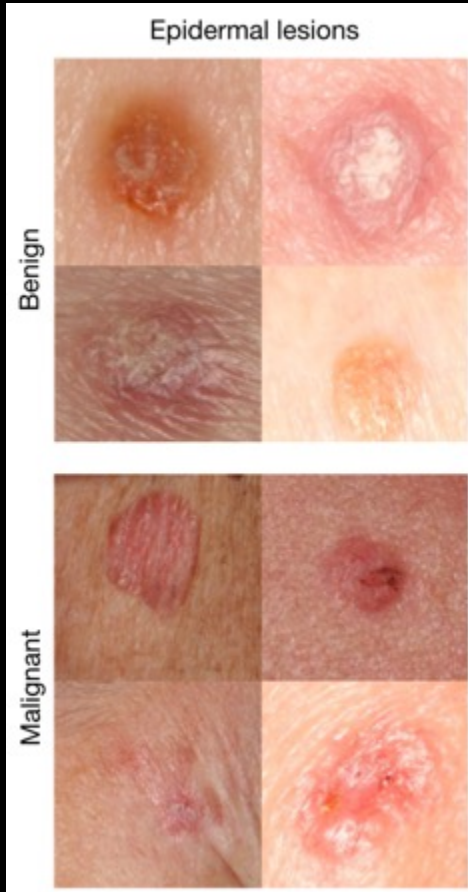


edges



pixels

Where is this useful?

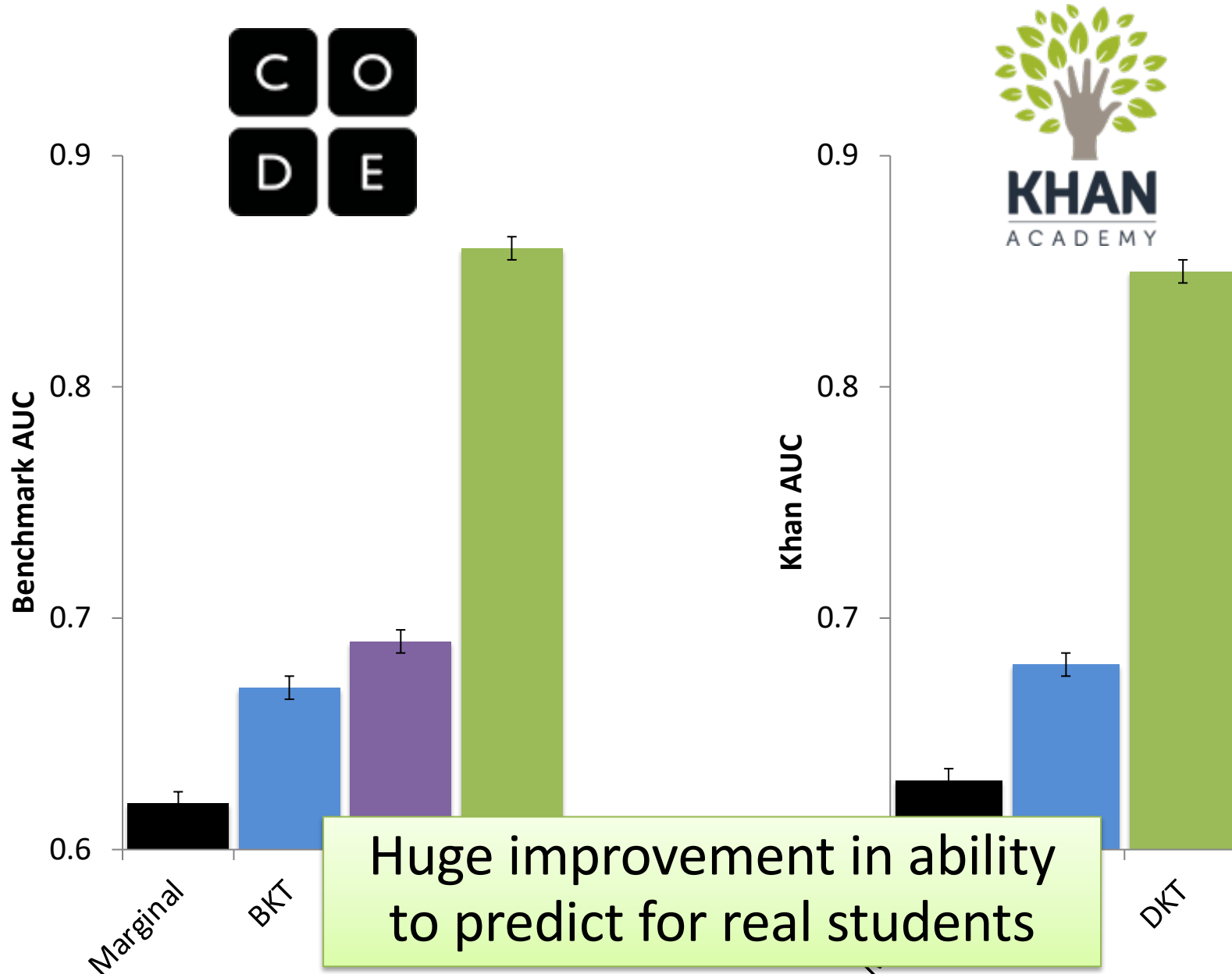


A machine learning algorithm performs **better than** the best dermatologists.

Developed this year, at Stanford.

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

Understanding Students



1. How to make your own project
2. What other languages look like
3. Deep Learning in Python