



# Intro to Deep Learning

Chris Powell  
Software Engineer at Hudl

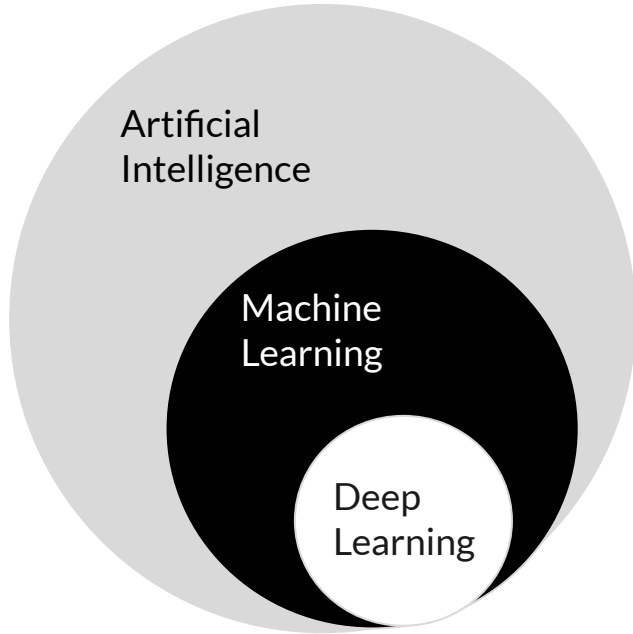


# What I'll be talking about today

1. What is 'Deep Learning'?
2. How does a neural network work?
3. What are a few examples of Deep Learning models and why would I use them?
4. What are the downsides to choosing a neural network for my next machine learning project?



# Deep Learning is a subset of Machine Learning



# Examples of Deep Learning

“Frame Oracle” →

A series of processes that produce player information, that includes a Deep Learning Convolutional Neural Network.





Reviewing the output of Frame Oracle on top of the video that was input to the model.

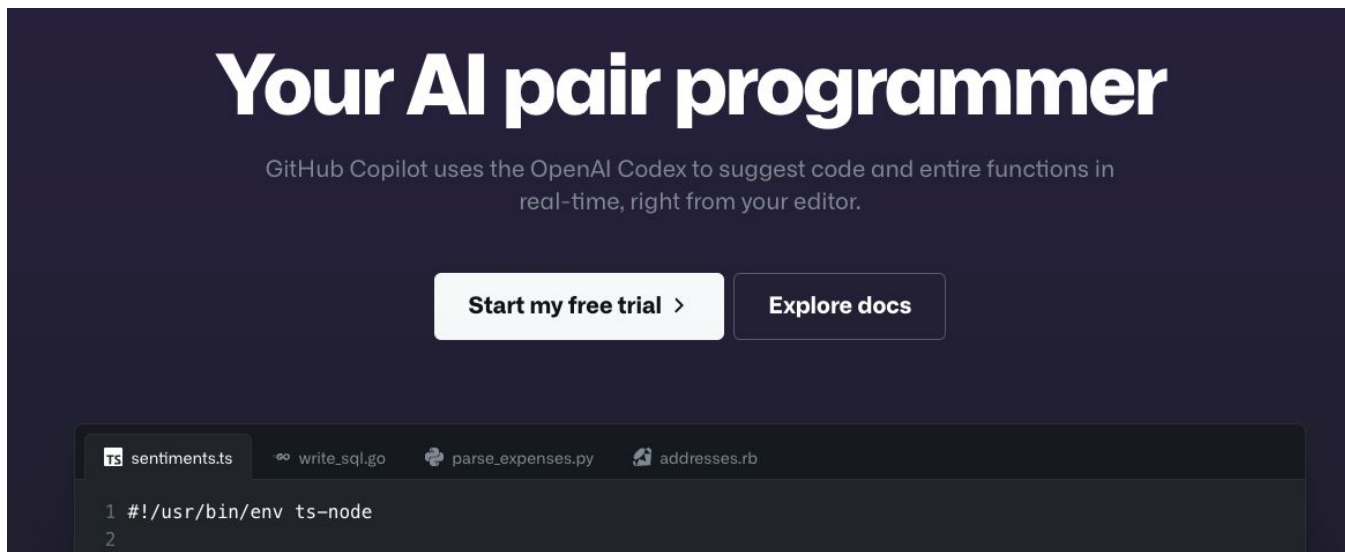


Predicting the state of American Football games.



# Examples of Deep Learning

GitHub Copilot



**Your AI pair programmer**

GitHub Copilot uses the OpenAI Codex to suggest code and entire functions in real-time, right from your editor.

[Start my free trial >](#) [Explore docs](#)

ts sentiments.ts   go write\_sql.go   python parse\_expenses.py   ruby addresses.rb

```
1 #!/usr/bin/env ts-node
2
```



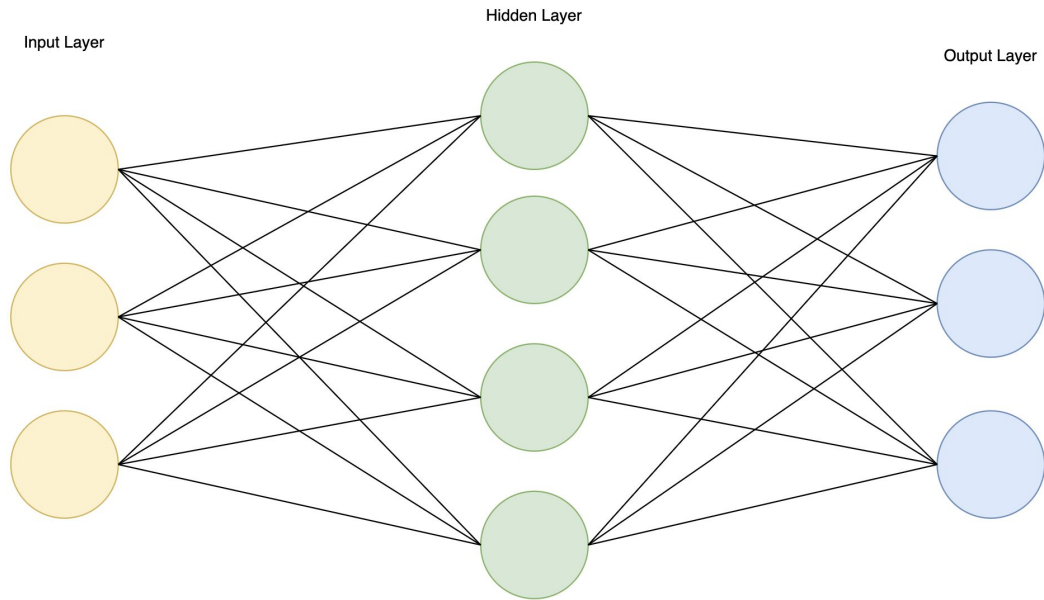
DALL-E created the cover for a recent magazine. DALL-E uses CLIP is an example of a deep learning model.



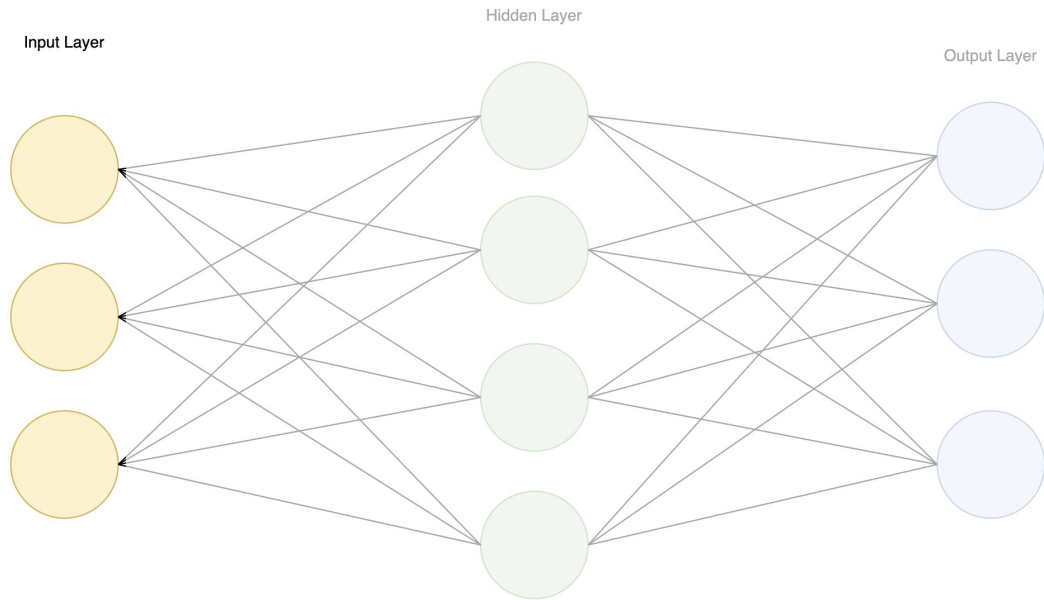
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# Neural Networks

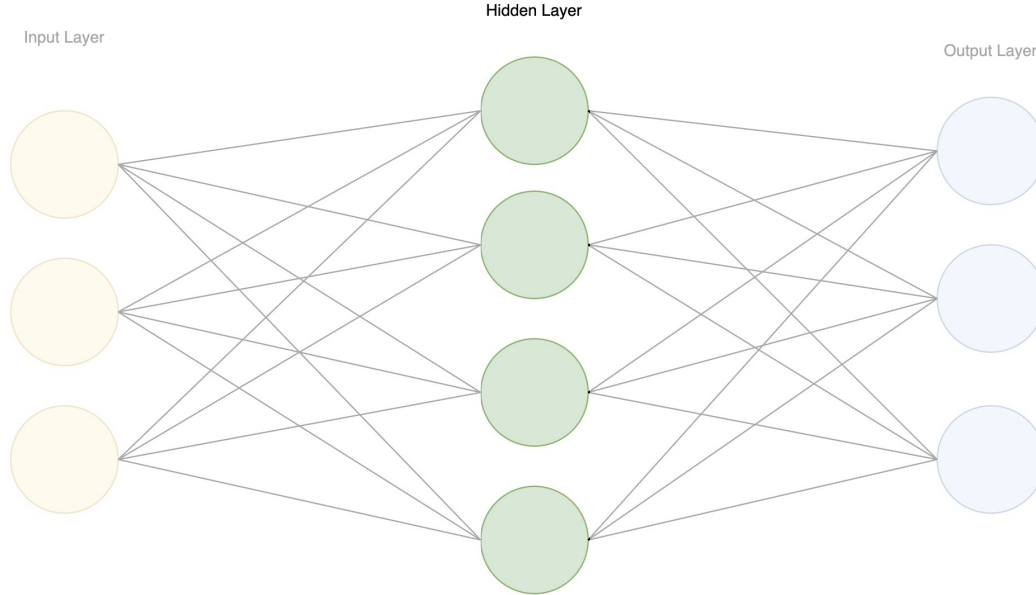
# Overview of neural network



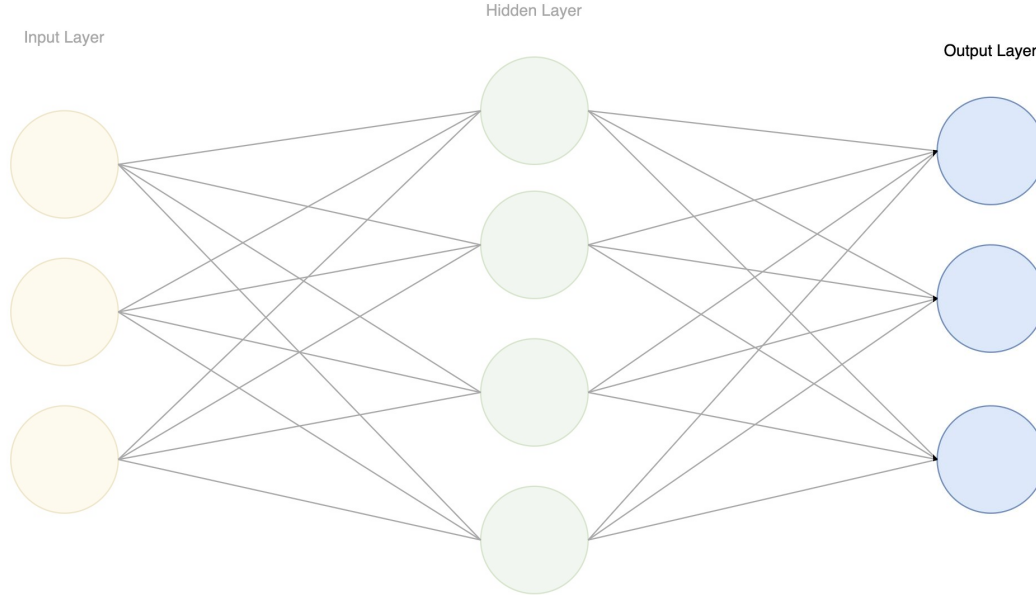
# Input Layer = Array of Values



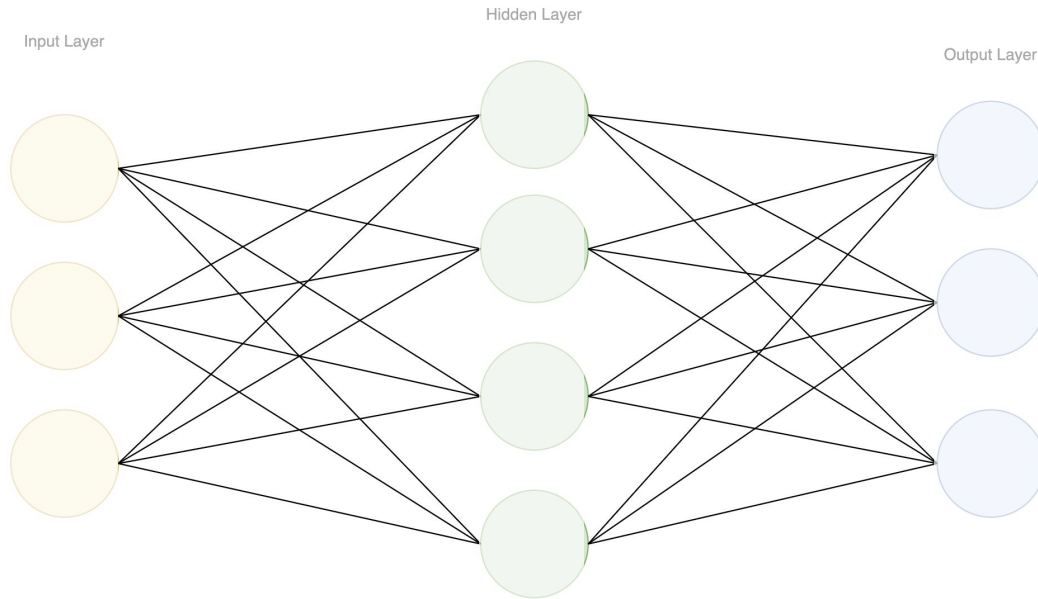
# Hidden Layer(s) = where the network learns



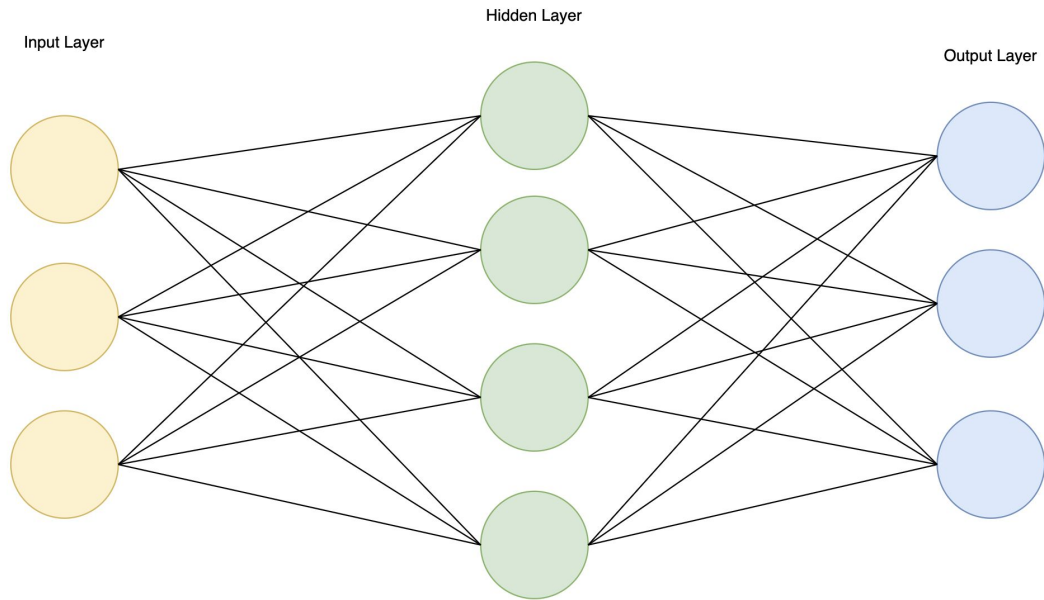
# Output Layer = matches the problem type



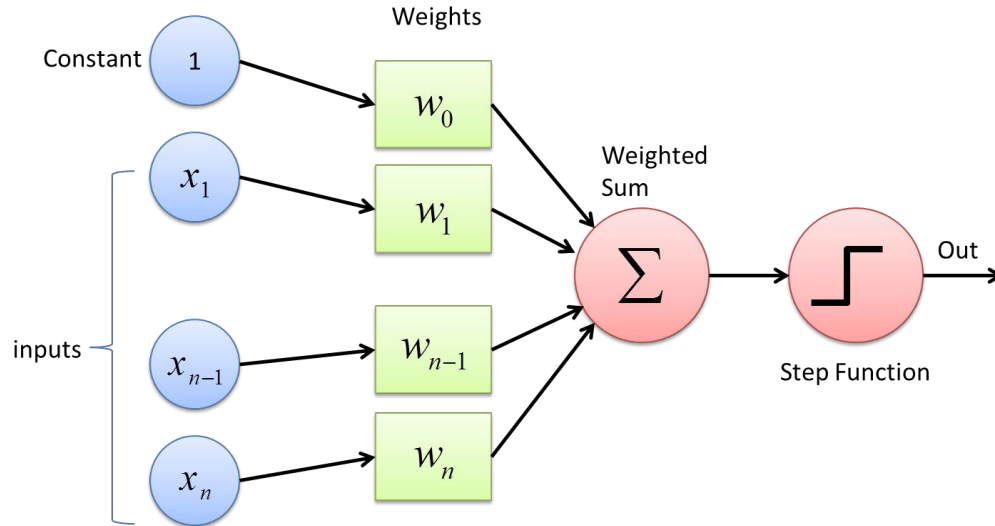
# Connections = Weighted Edges



# Overview of neural network

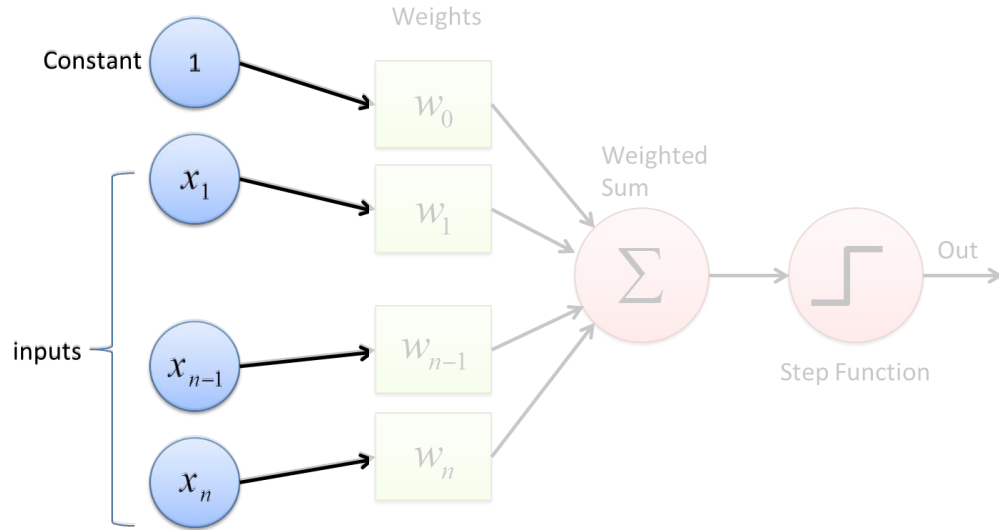


# Perceptron: Single Layer Neural Network

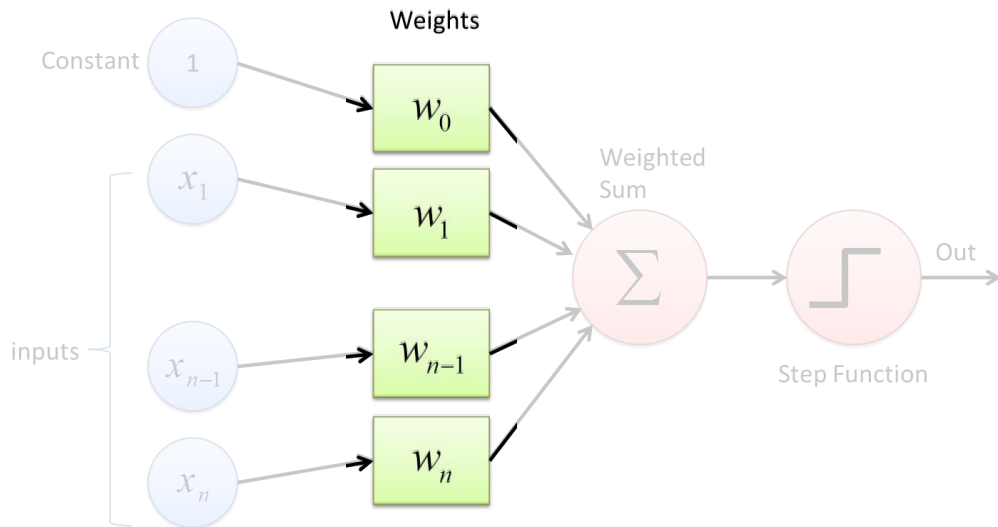




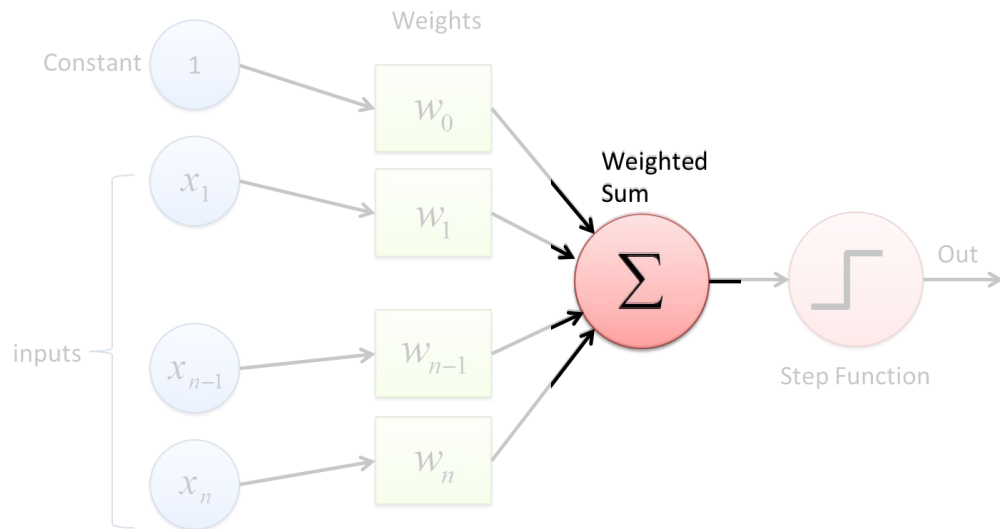
# Inputs and Bias



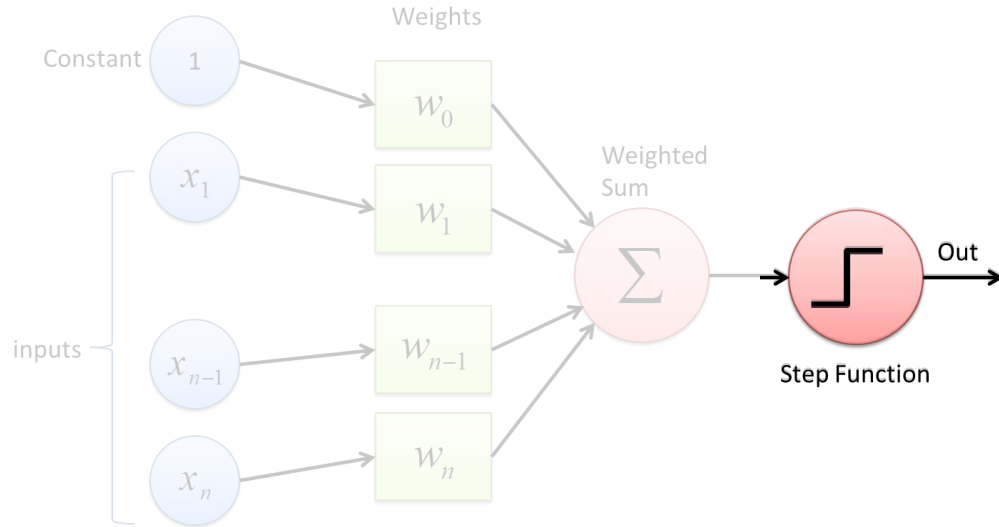
# Weights for each input



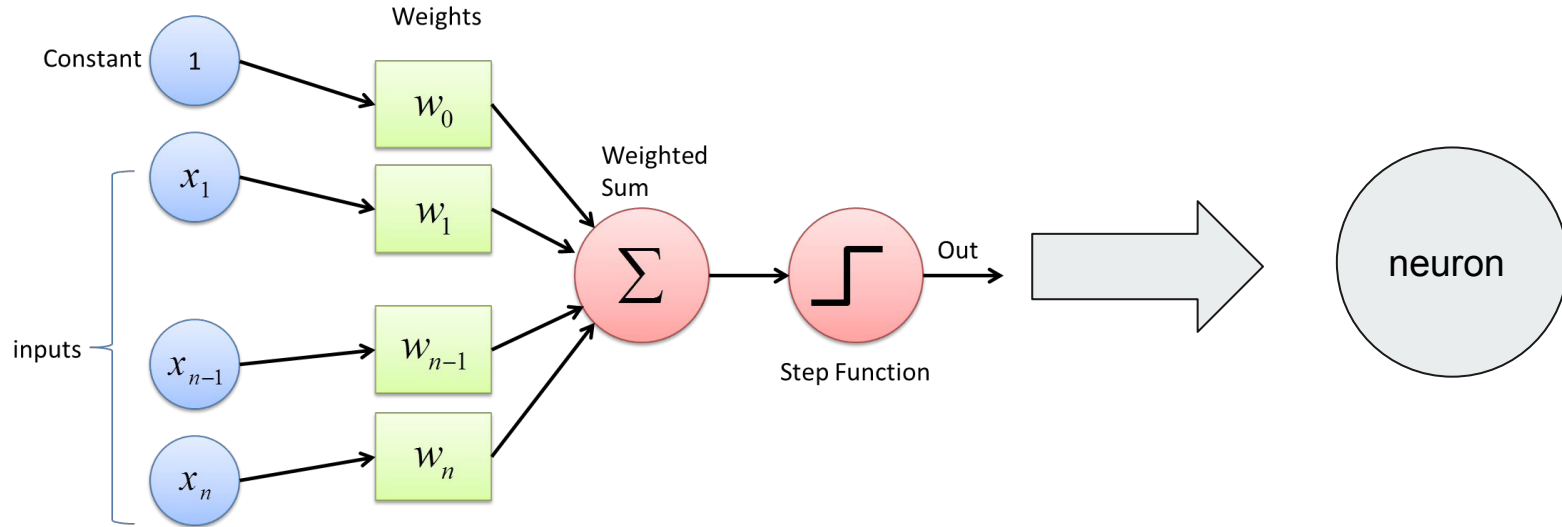
# Added together



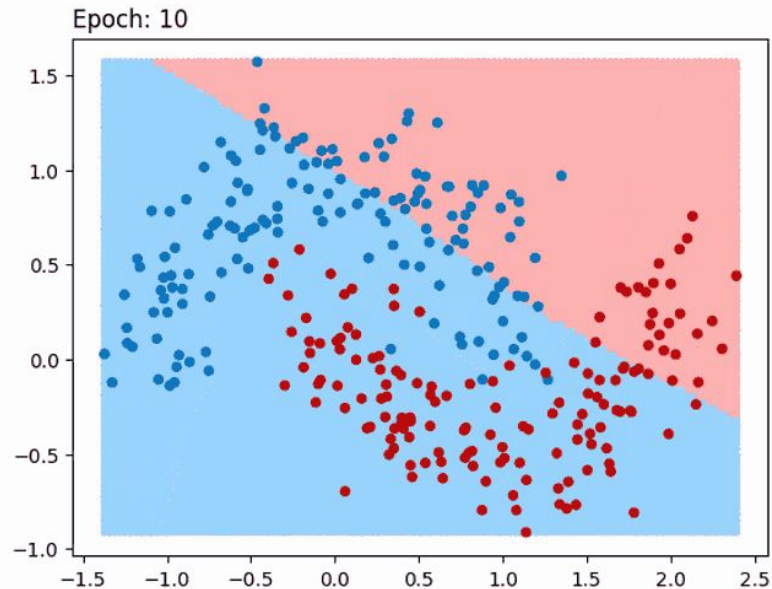
## Multiplied by an activation function



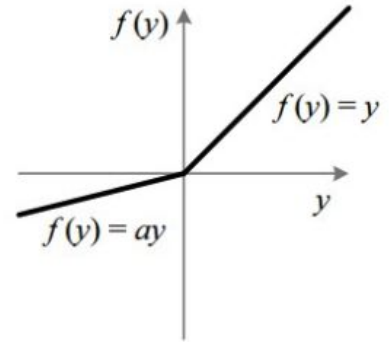
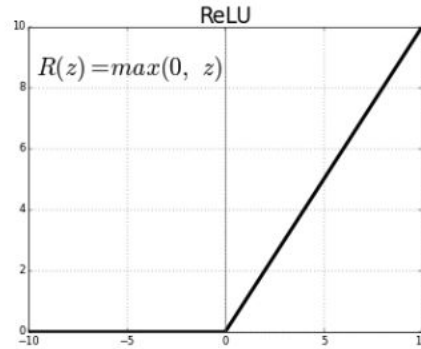
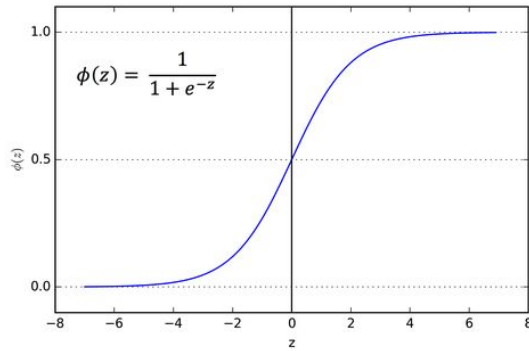
# Perceptron: Single Layer Neural Network



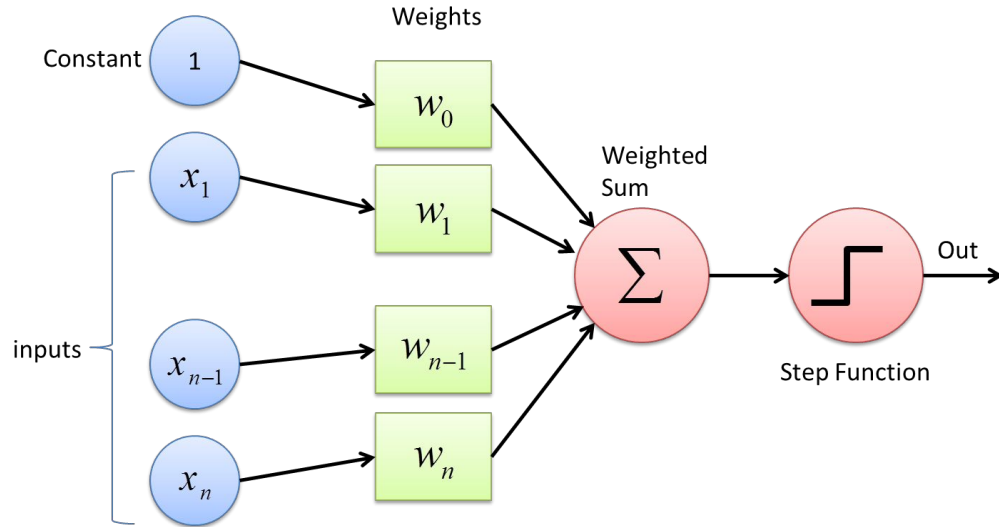
# Why use an activation function?



# Non-linear Activation Functions

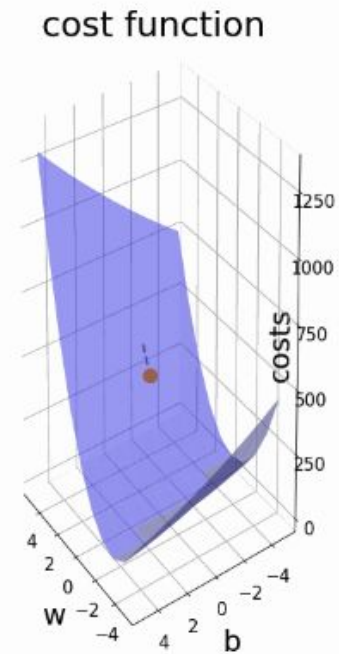
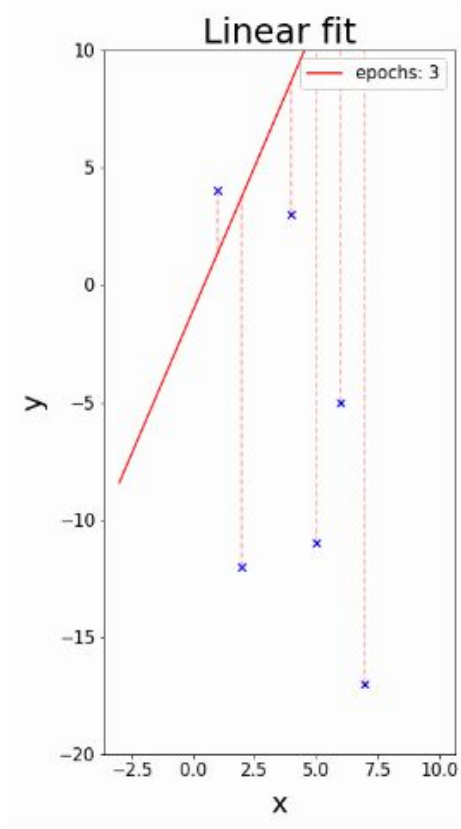


# Backpropagation





# Gradient Descent

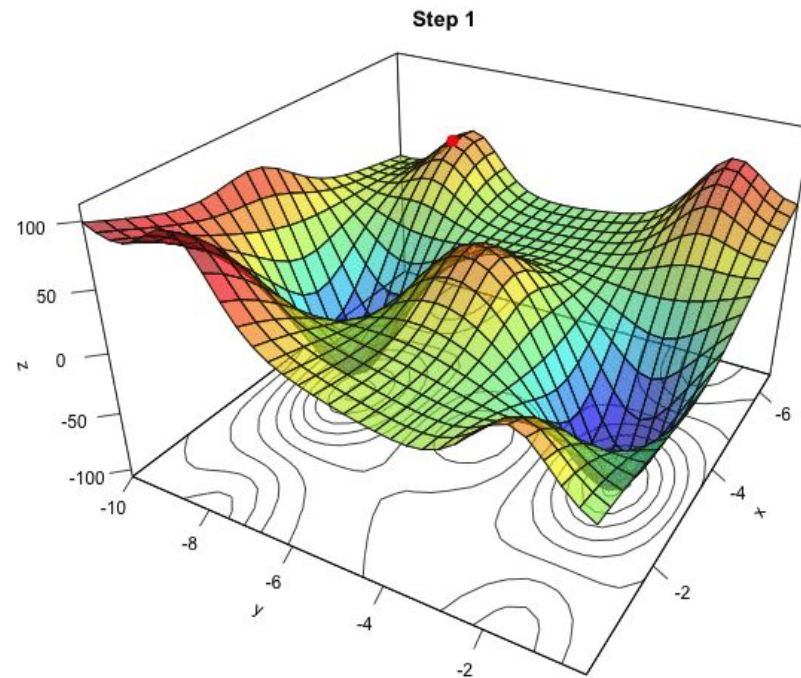




# Gradient Descent



# Gradient Descent



## Initializing Weights in Network



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# Convolutional Neural Networks (CNNs)

# Real World Applications

Frame Oracle

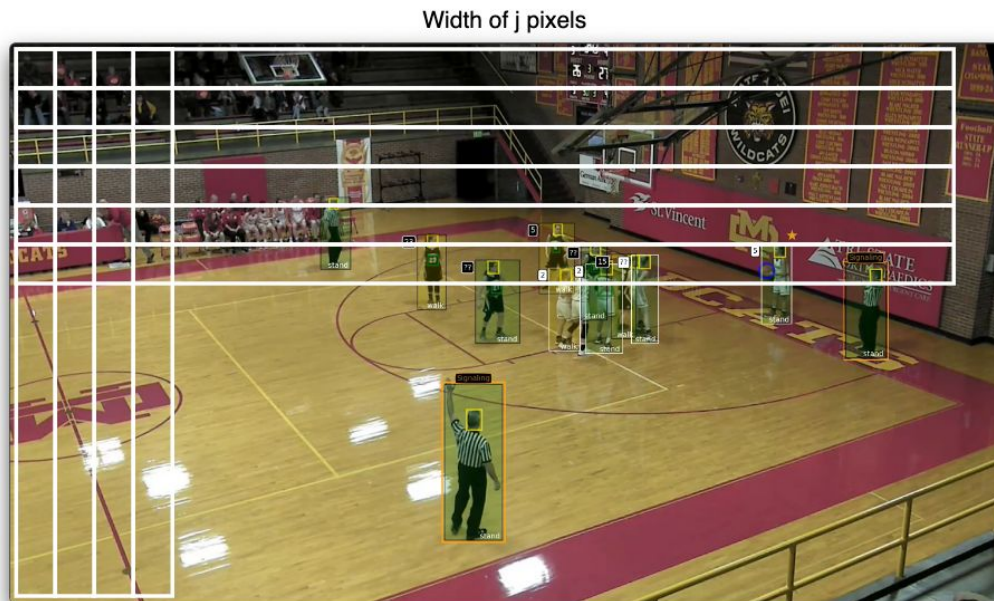


# Input: Spatial Relationship

Frame Oracle

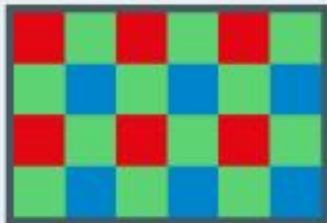
Matrix of  $(i, j)$  values that  
correspond to colors

Height  
of  $i$   
pixels



## Size of inputs

Standard definition (SD)

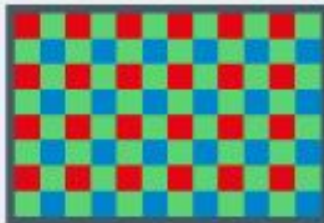


704 x 576 pixels

**405,504**

pixels in total

Full HD

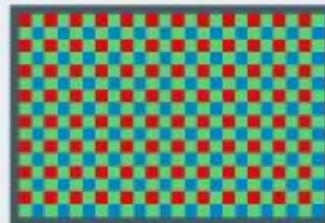


1,920 x 1,080 pixels

**2,073,600**

pixels in total

4K UHD



3,840 x 2,160 pixels

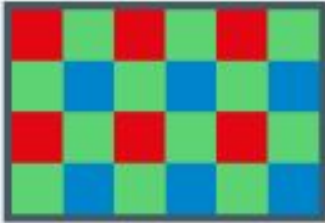
**8,294,400**

pixels in total




$$4K\ UHD^2 * 100 = 6,872,410,000,000,000$$

Standard definition (SD)

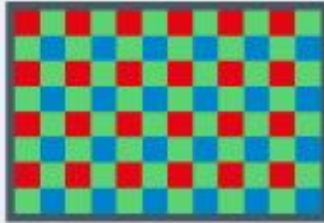


704 x 576 pixels

**405,504**

pixels in total

Full HD

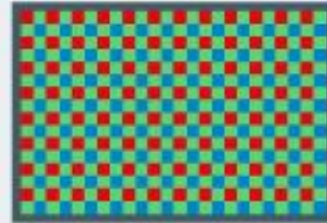


1,920 x 1,080 pixels

**2,073,600**

pixels in total

4K UHD



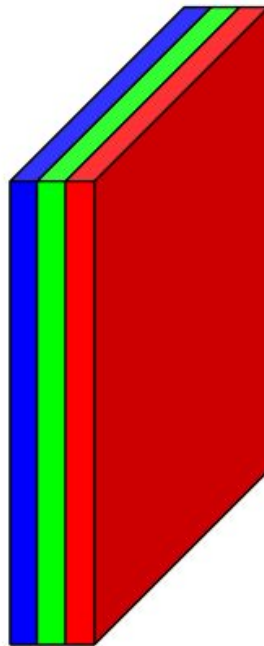
3,840 x 2,160 pixels

**8,294,400**

pixels in total



Input: RGB layers

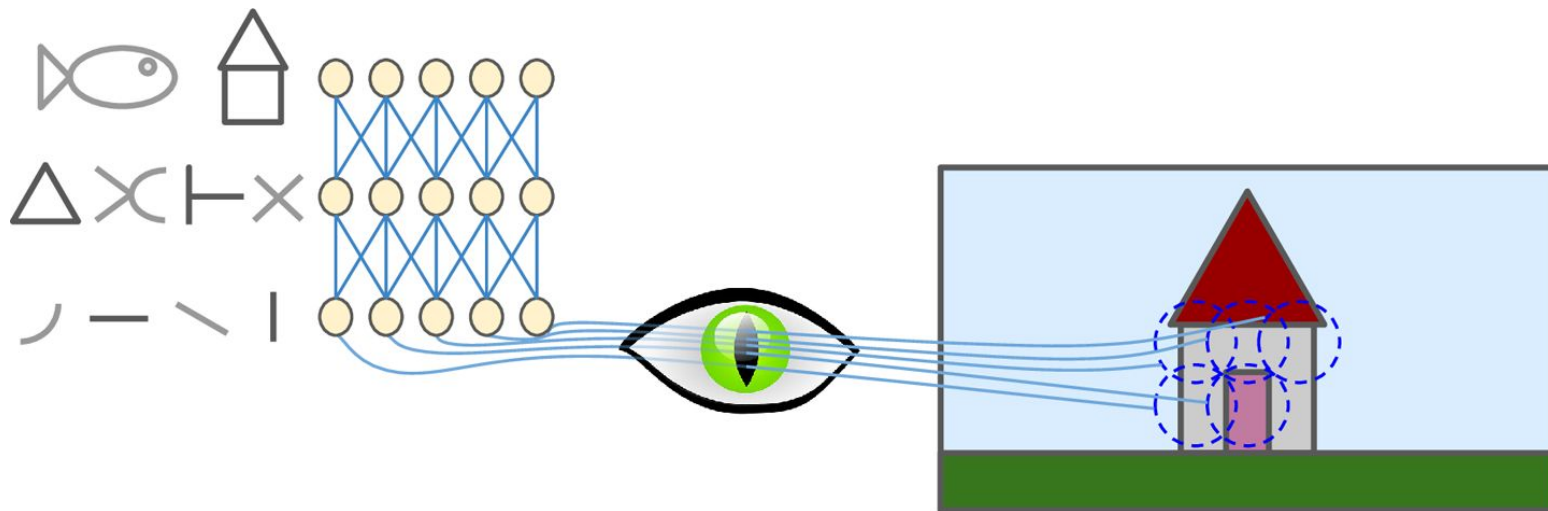


RGB  
Image  
 $M \times N \times 3$



Grayscale/Binary  
Image  
 $M \times N \times 1$

## Breaking Down An Image



# Input: Spatial Relationship

To avoid losing the spatial information, we consider subsections of the image together.

Height  
of  $m$   
pixels

Width of  $n$  pixels

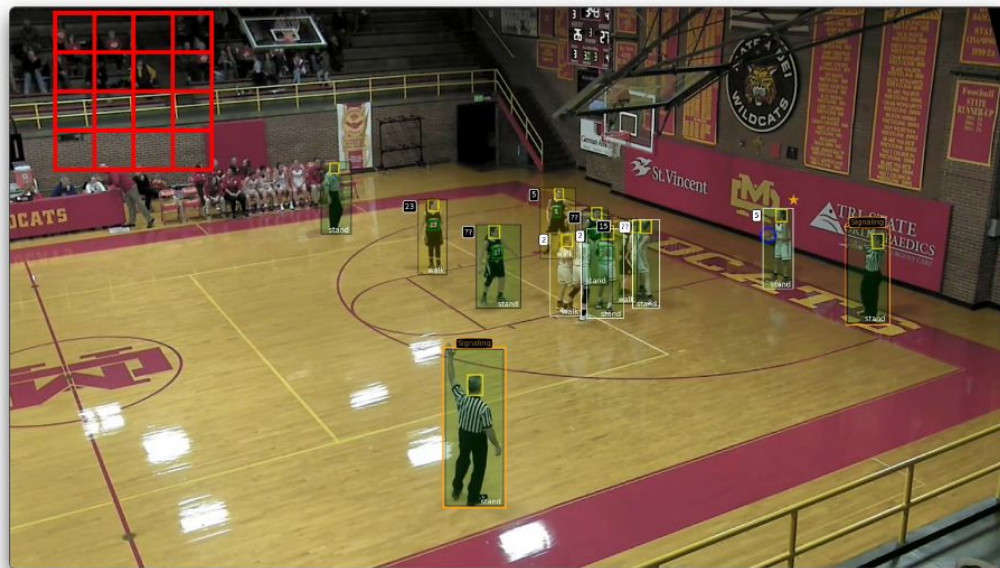


# Input: Spatial Relationship

To avoid losing the spatial information, we consider subsections of the image together.

Height  
of  $m$   
pixels

Width of  $n$  pixels

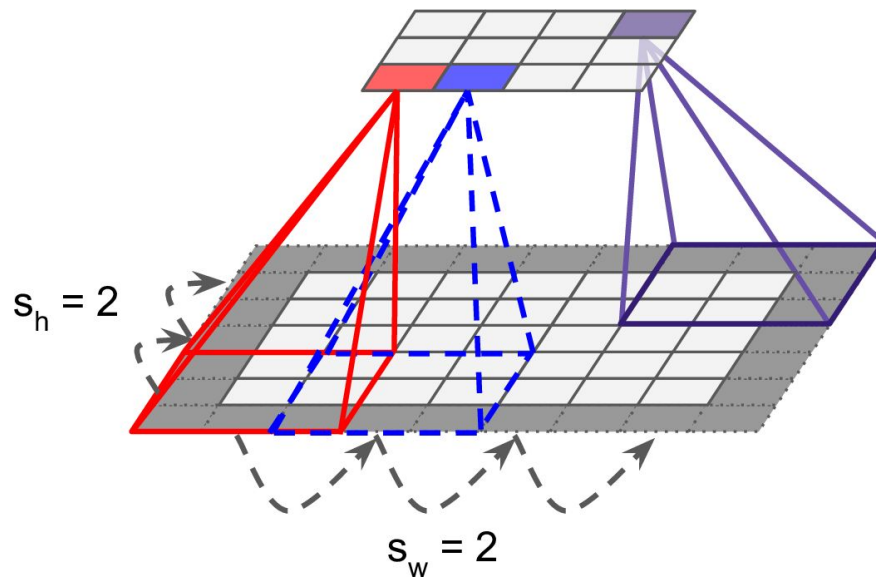


# Input: Spatial Relationship

To avoid losing the spatial information, we consider subsections of the image together.



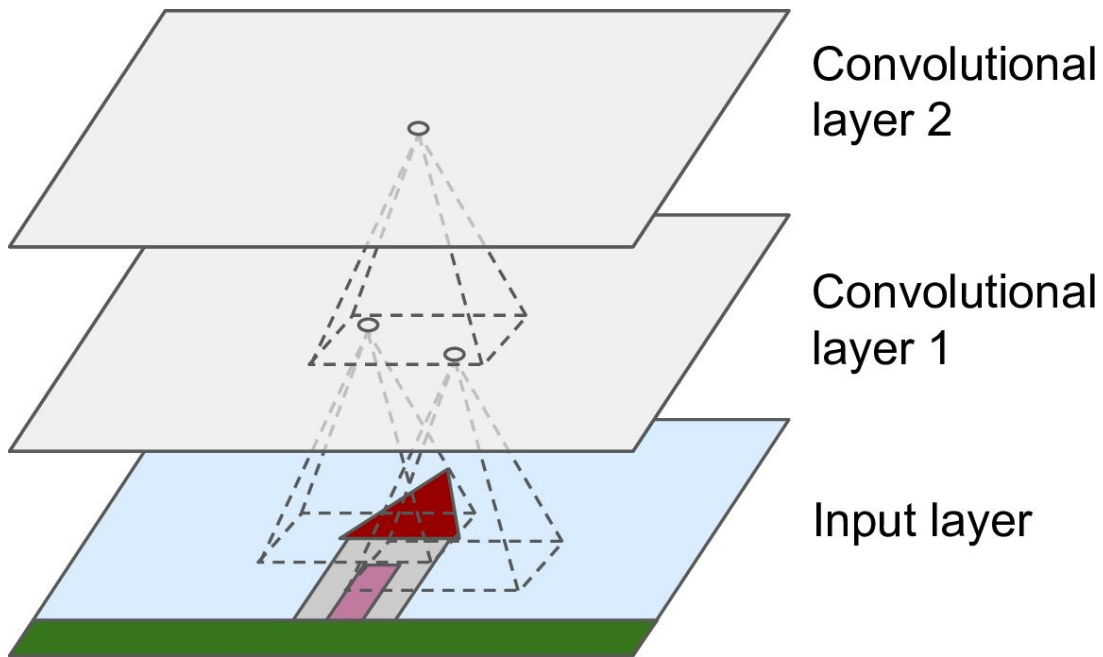
## Turning regions into single values





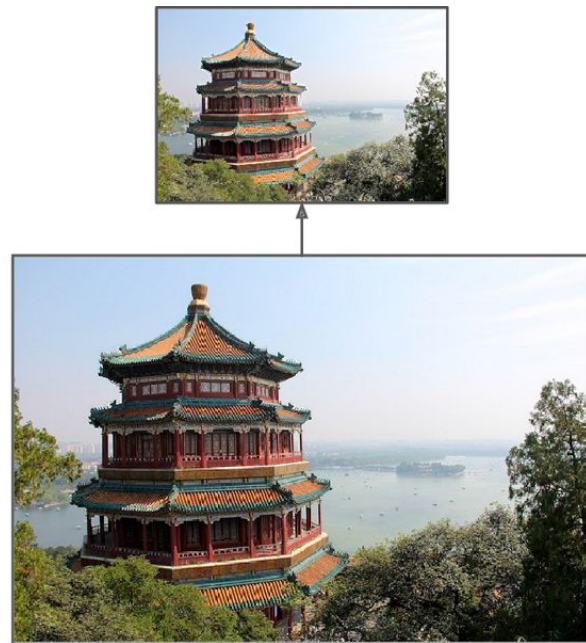
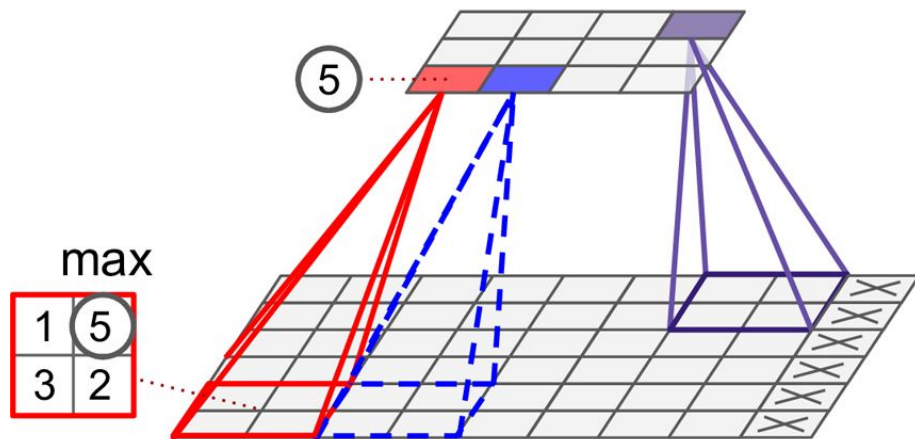


## Turning regions into single values



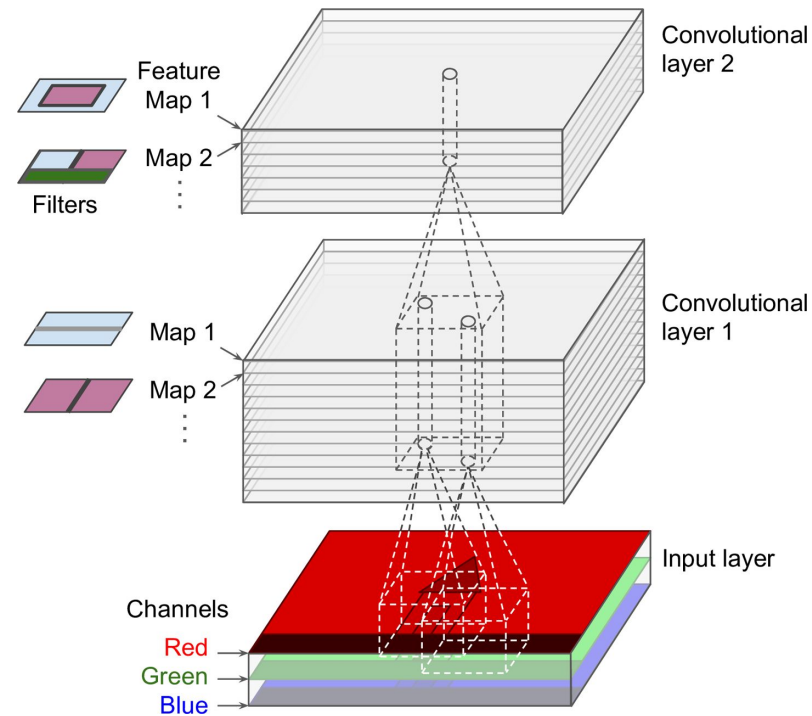


# Pooling

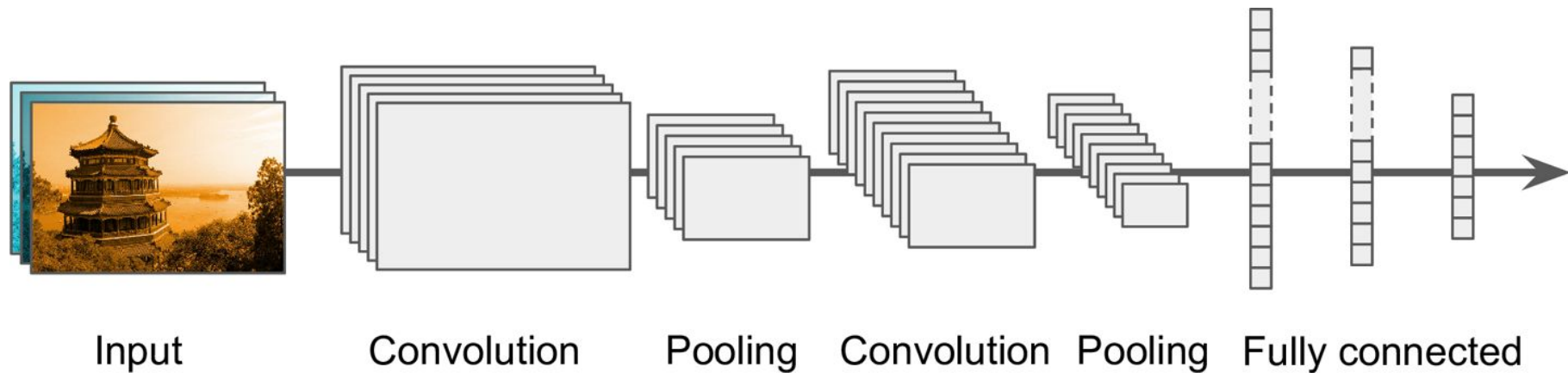




# Stacking convolutional layers



## So what does a whole CNN look like?



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# Recurrent Neural Networks



# Real World Applications

NEWS

Jul 07, 2020

## OpenAI Presents GPT-3, a 175 Billion Parameters Language Model

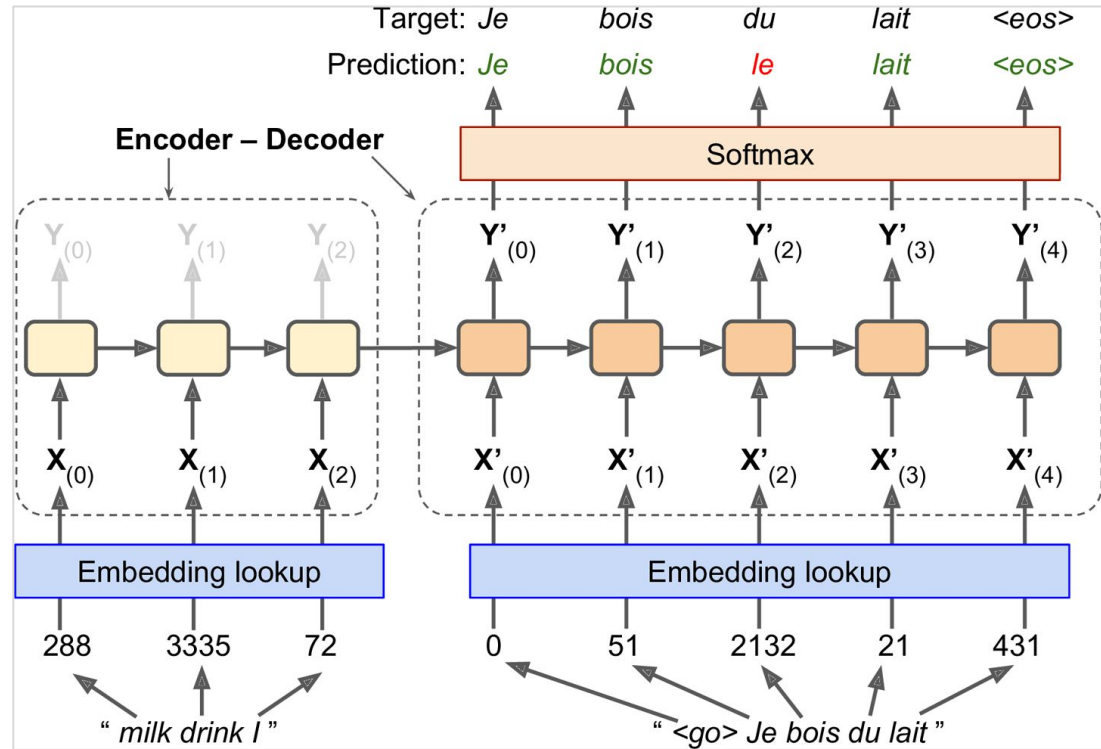
By [Nefi Alarcon](#)

 Discuss (0)  Share  0 Like

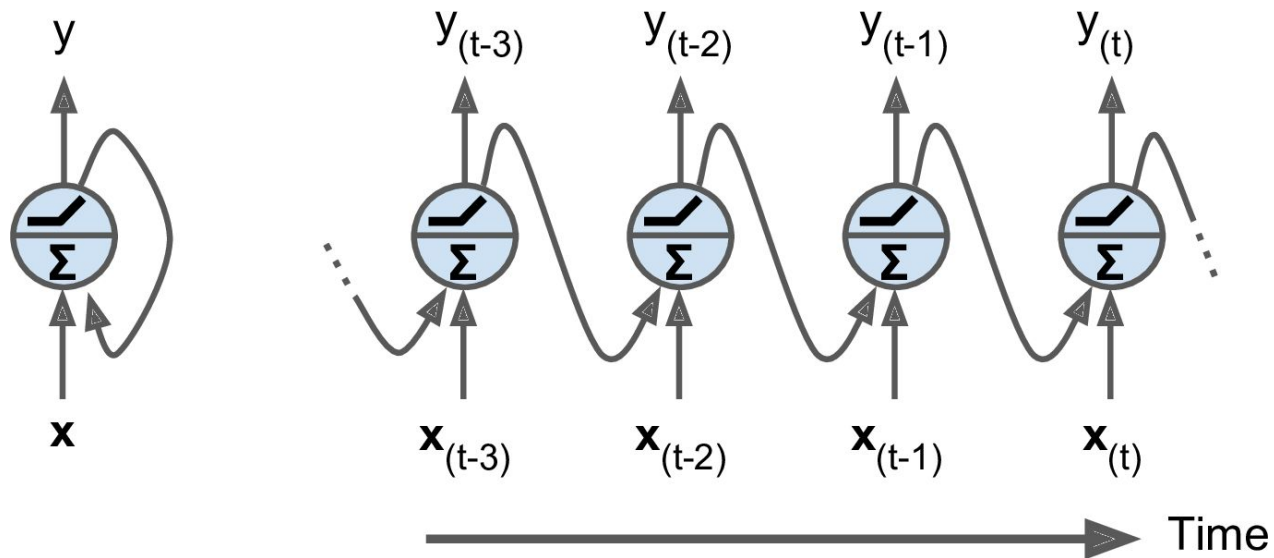
Tags: [featured](#), [Machine Learning & Artificial Intelligence](#), [News](#), [Speech & Audio Processing](#), [Supercomputing / Cluster](#)



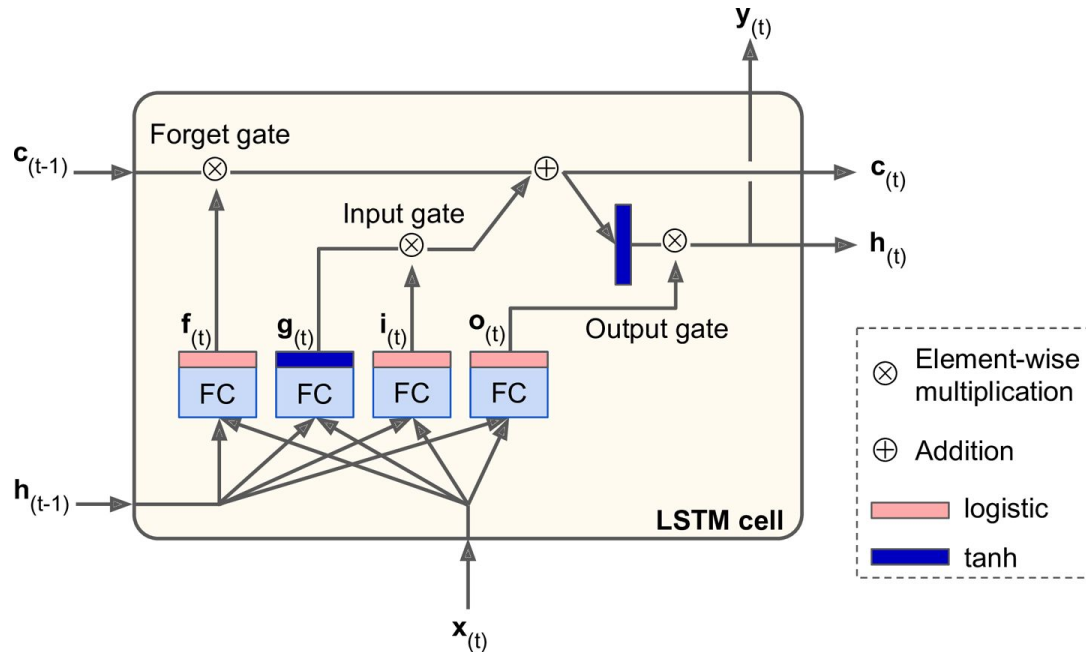
# Input



# Architecture

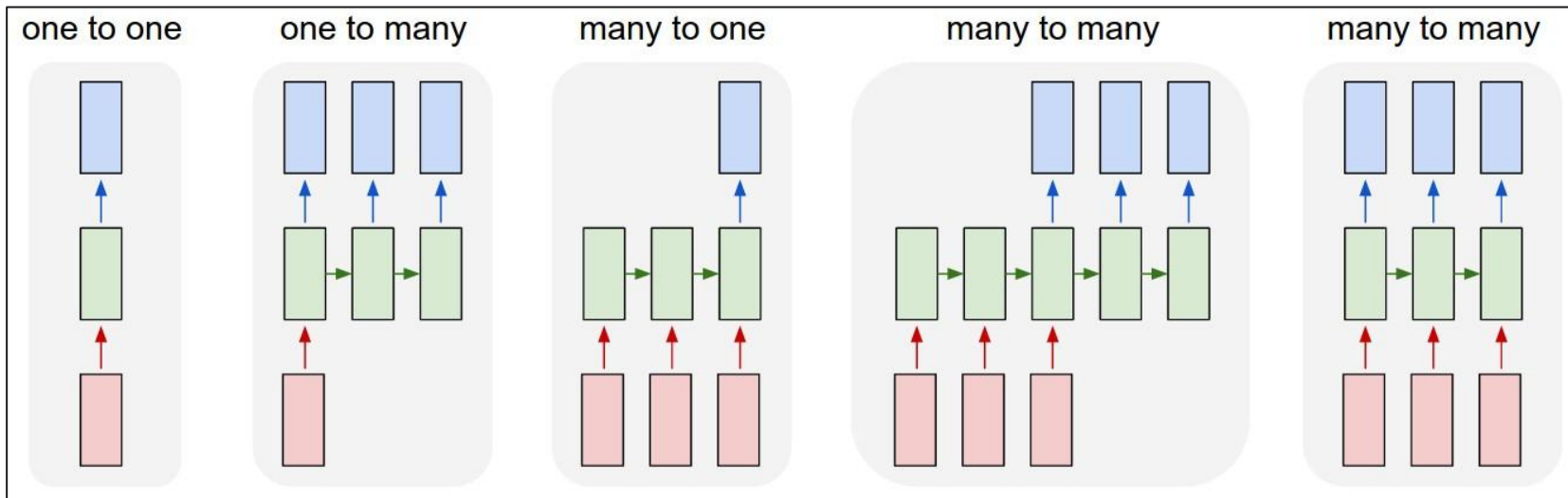


# Architecture: Long-Short Term Memory Cells





# Output



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# Disadvantages of Neural Networks



## Black Box

NEWS

Jul 07, 2020

# OpenAI Presents GPT-3, a 175 Billion Parameters Language Model

By **Nefi Alarcon**

 Discuss (0)  Share  0 Like

Tags: featured, Machine Learning & Artificial Intelligence, News, Speech & Audio Processing, Supercomputing / Cluster





# Black Box

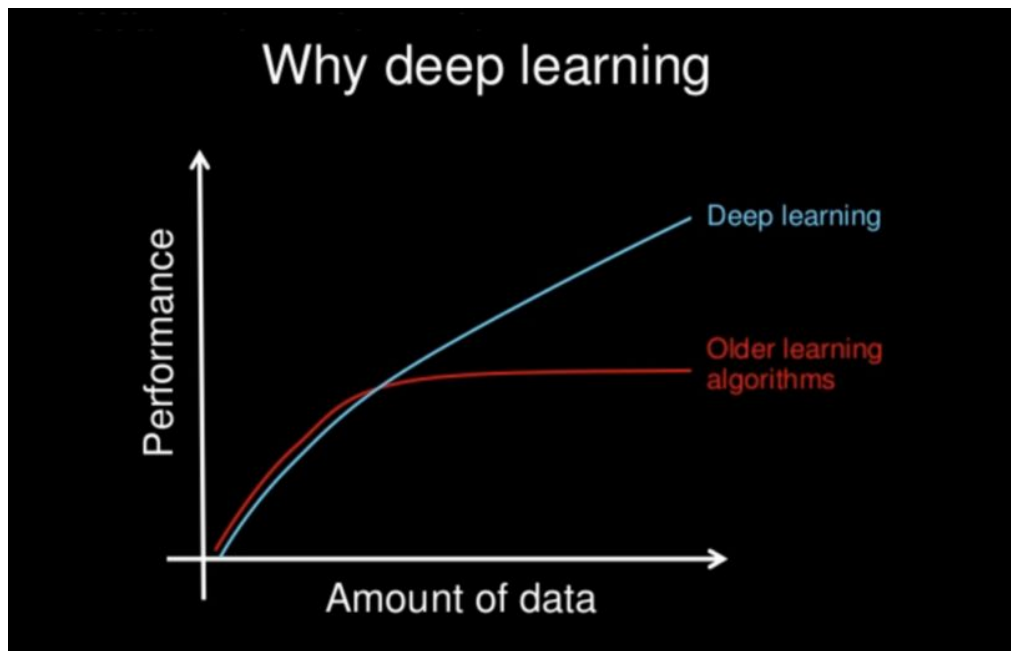




# Training Time/Computation



## Neural Networks need a lot of data



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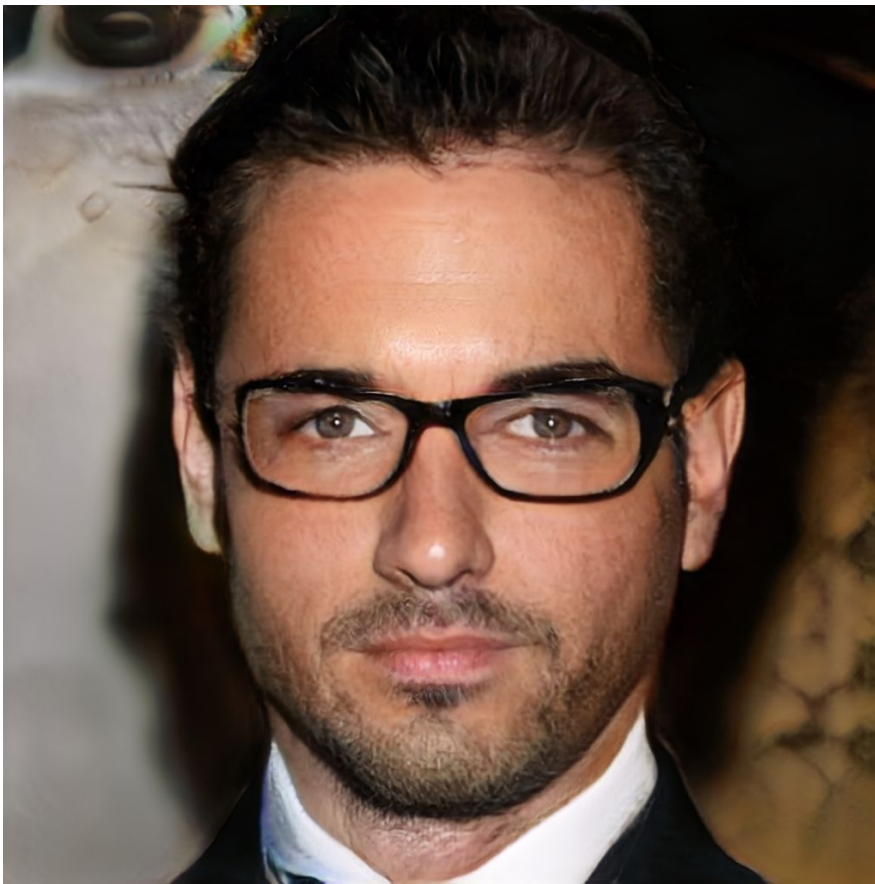
**Thanks for listening to my  
presentation**

**Additional topics and citations after  
this slide**

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# Generative Adversarial Networks (GANs)

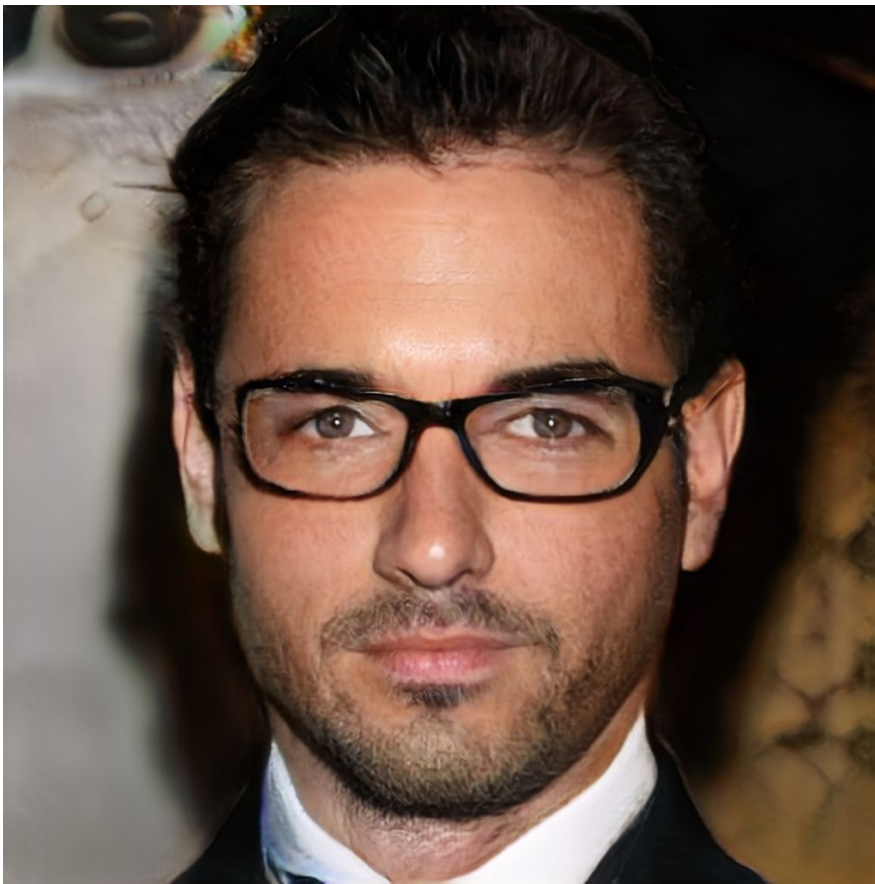




Do you know this celebrity?



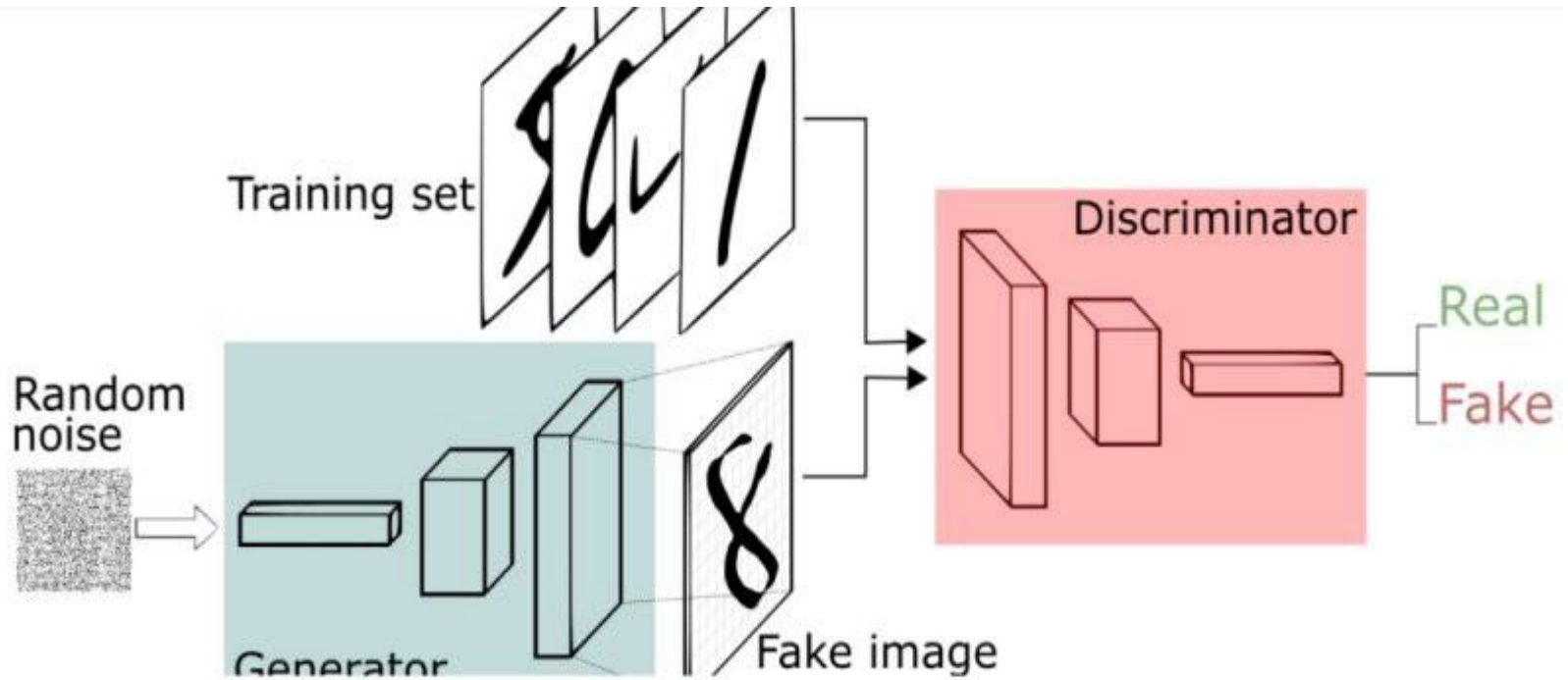
Do you know this celebrity?



His backdrop is very odd. The glasses don't seem to connect to his right ear.



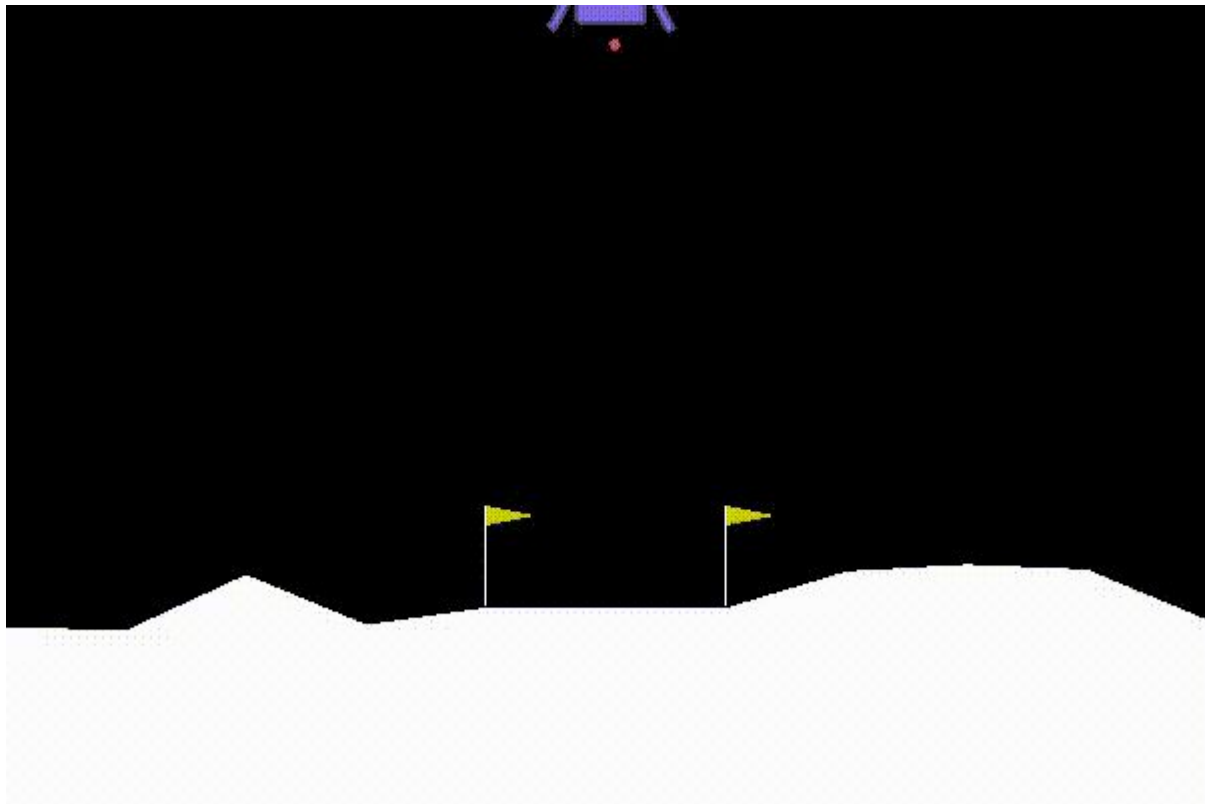
Why is she wearing two different earrings? Does the skin around her left eye look older than the right?



Architecture for a GAN

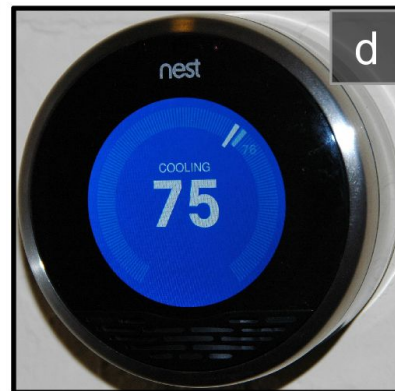
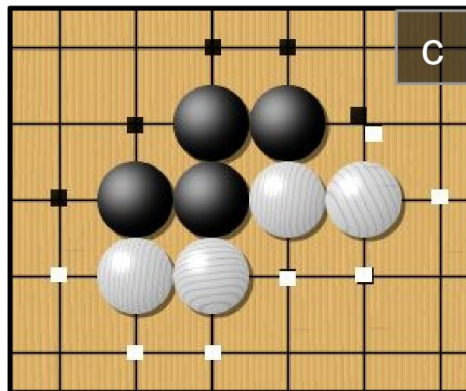
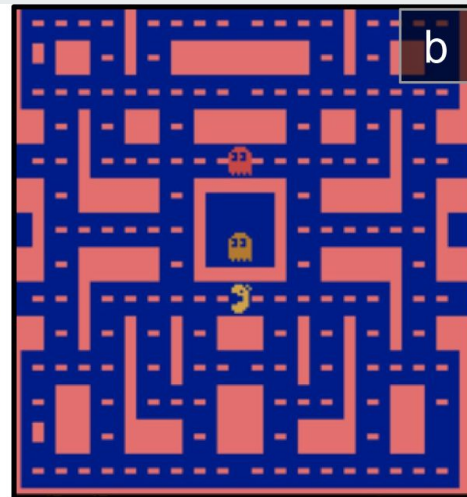
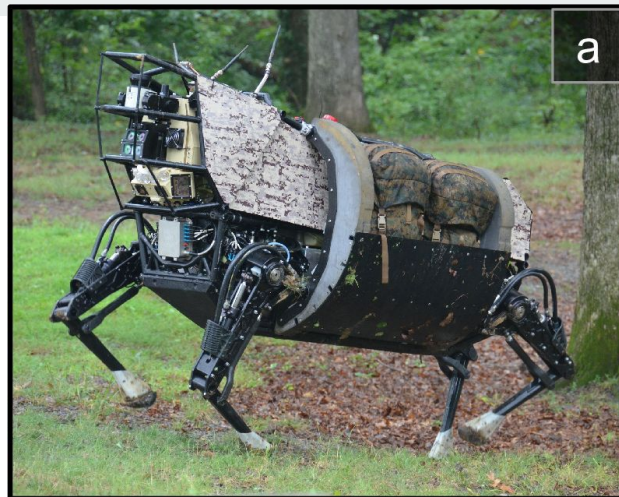
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# Reinforcement Learning





# Examples





# OpenAI Five

## 2016–2019

At OpenAI, we've used the multiplayer video game [Dota 2](#) as a research platform for general-purpose AI systems. Our Dota 2 AI, called OpenAI Five, learned by playing over 10,000 years of games against itself. It demonstrated the ability to achieve [expert-level performance](#), learn [human-AI cooperation](#), and [operate at internet scale](#).

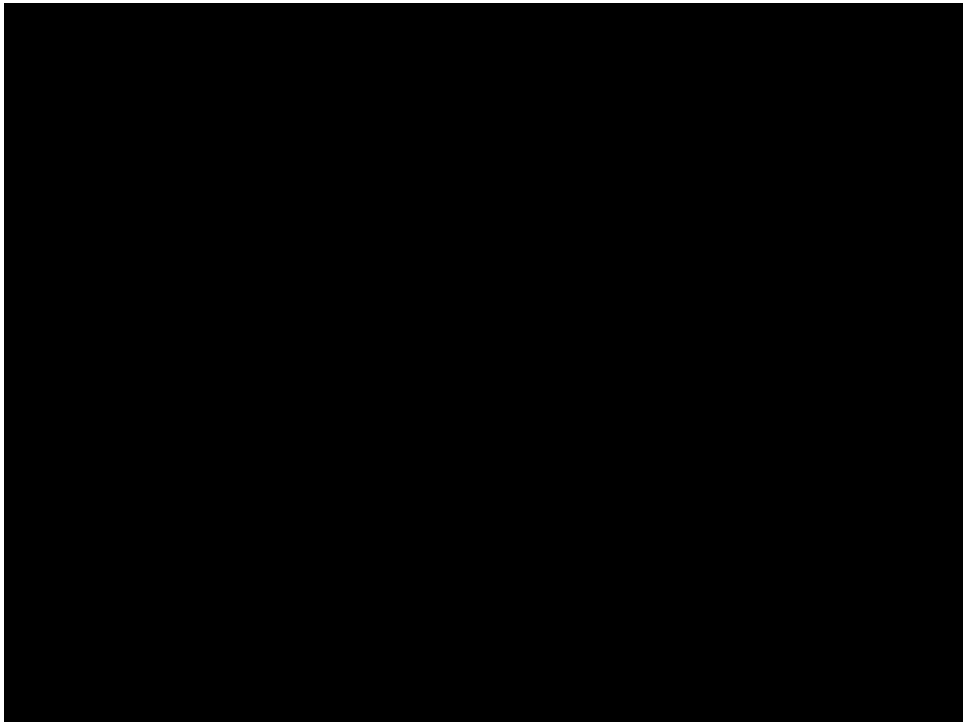
[READ PAPER](#)[READ BLOG POSTS](#)

### OpenAI Five training progress

TrueSkill rating vs. pfs-days of compute

- Measurement sample
- Match Win
- Match Loss





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# Model Zoos and Transfer Learning



# Model Zoo?

## Model Zoo

Discover open source deep learning code and pretrained models.

[Browse Frameworks](#)[Browse Categories](#)

### OpenPose

★ 14800

OpenPose represents the first real-time multi-person system to jointly detect human body, hand, and facial keypoints (in total 130 keypoints) on single images.

[Caffe](#)[CV](#)

### Mask R-CNN

★ 14504

This is an implementation of Mask R-CNN on Python 3, Keras, and TensorFlow. The model generates bounding boxes and segmentation masks for each instance of an object in the image. It's based on Feature Pyramid Network (FPN) and a ResNet101 backbone.

[Keras](#)

### pytorch-CycleGAN-and-pix2pix

★ 9980

PyTorch implementation for both unpaired and paired image-to-image translation.

[PyTorch](#)[CV](#)[NLP](#)[Generative](#)



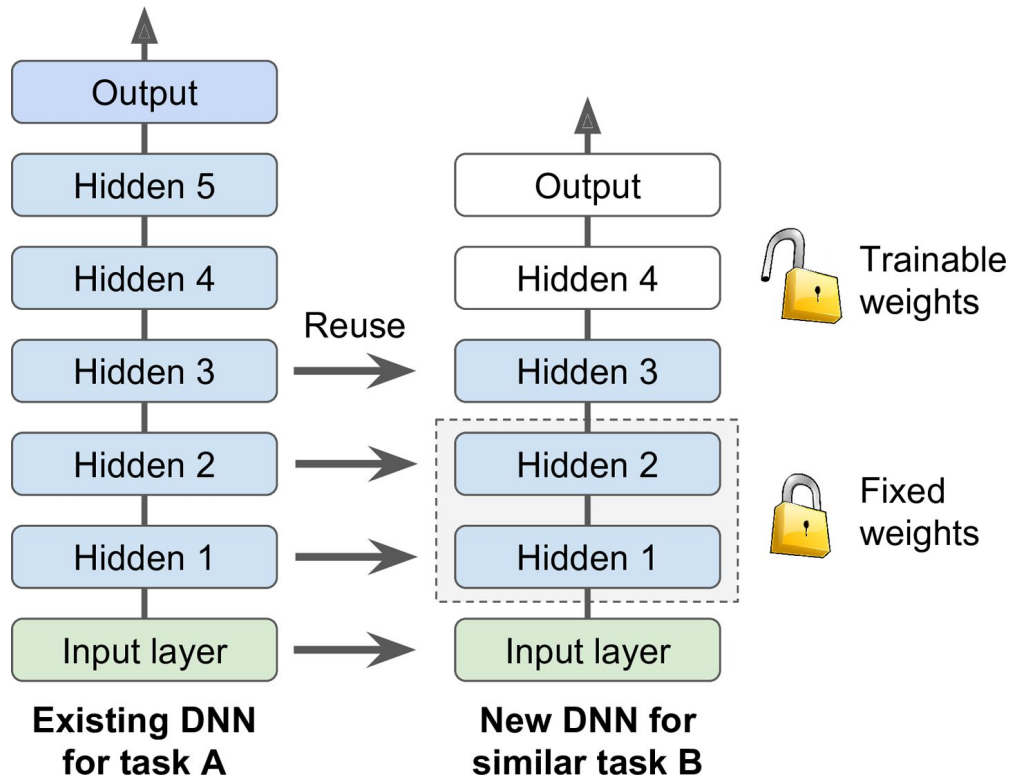
**Alternatively, use an API**



vertex.ai

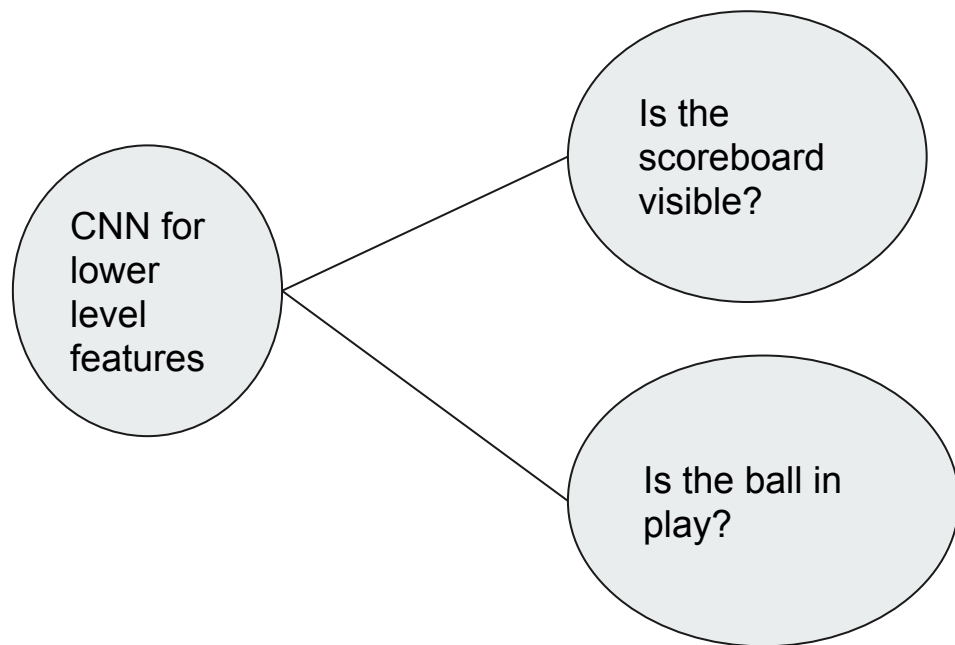


# Transfer Learning



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# Multi-task Models







# Why Deep Learning Now?

Big Data

GPU

Continued advancement in neural networks