



NAIIS MACHINE LEARNING BOOTCAMP

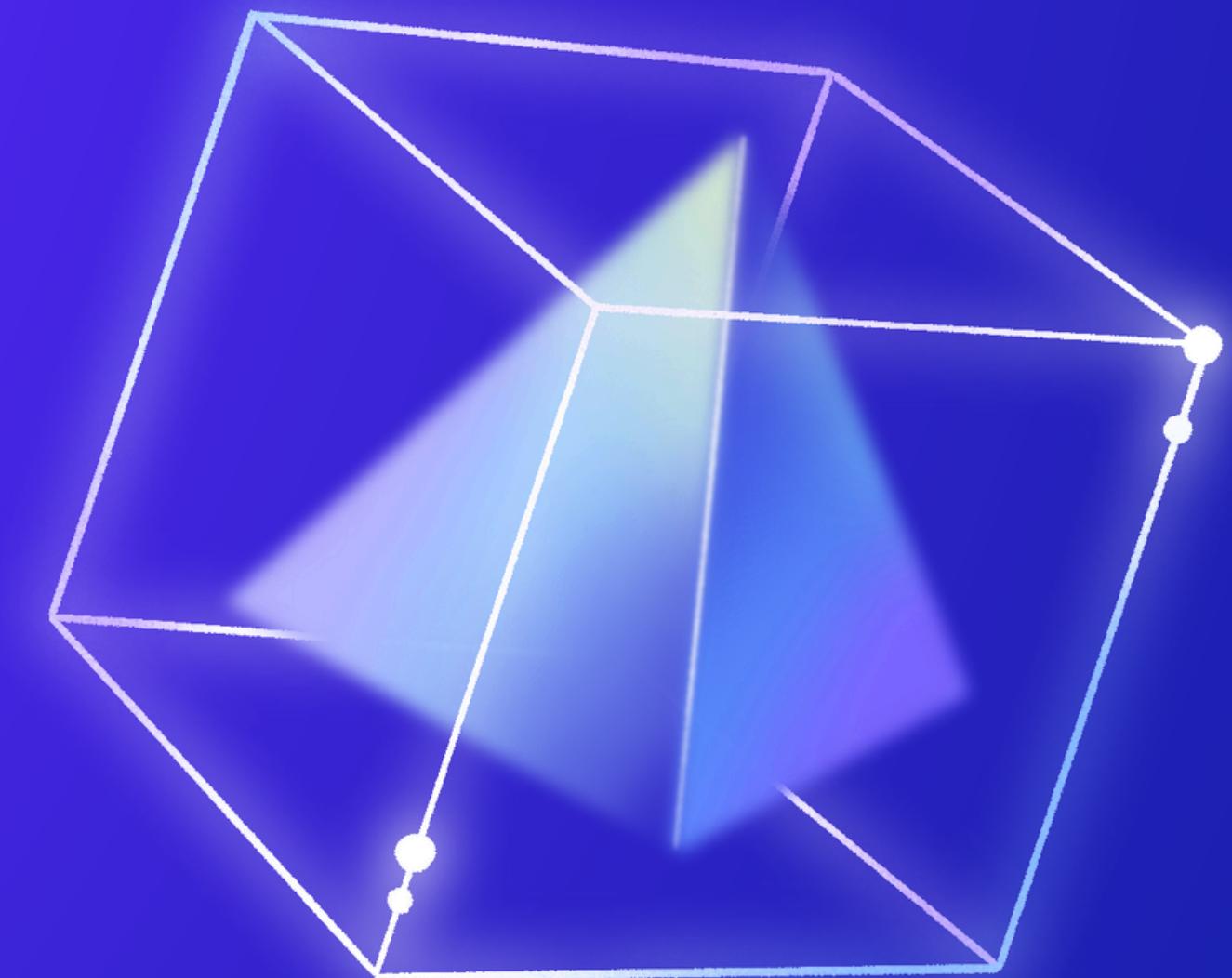
SESSION 1

WHITEBOX MODELS



AGENDA

- What exactly is Machine Learning?
- Types of Machine Learning Models
 - Linear Regression
 - Logistic Regression
 - Support Vector Machines
- Applications of these Algorithms



MACHINE LEARNING



What is it?

It's a field of study in AI that trains computers, using data and algorithms to draw patterns from data.

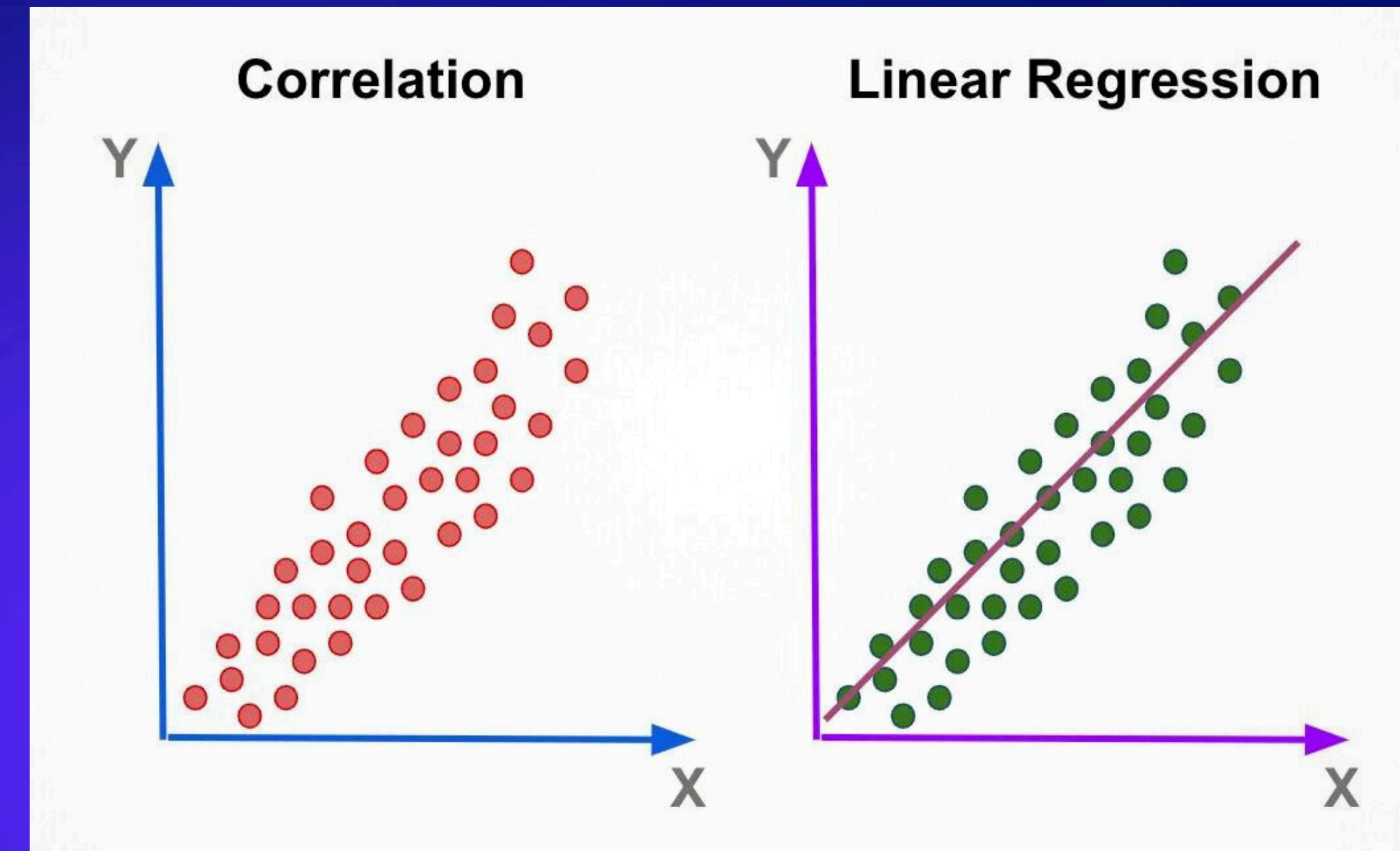
Machine Learning Process





LINEAR REGRESSION

Linear Regression is used to predict a variable based on the value of another variable.



LINEAR REGRESSION APPLICATIONS



Advertising vs Revenue



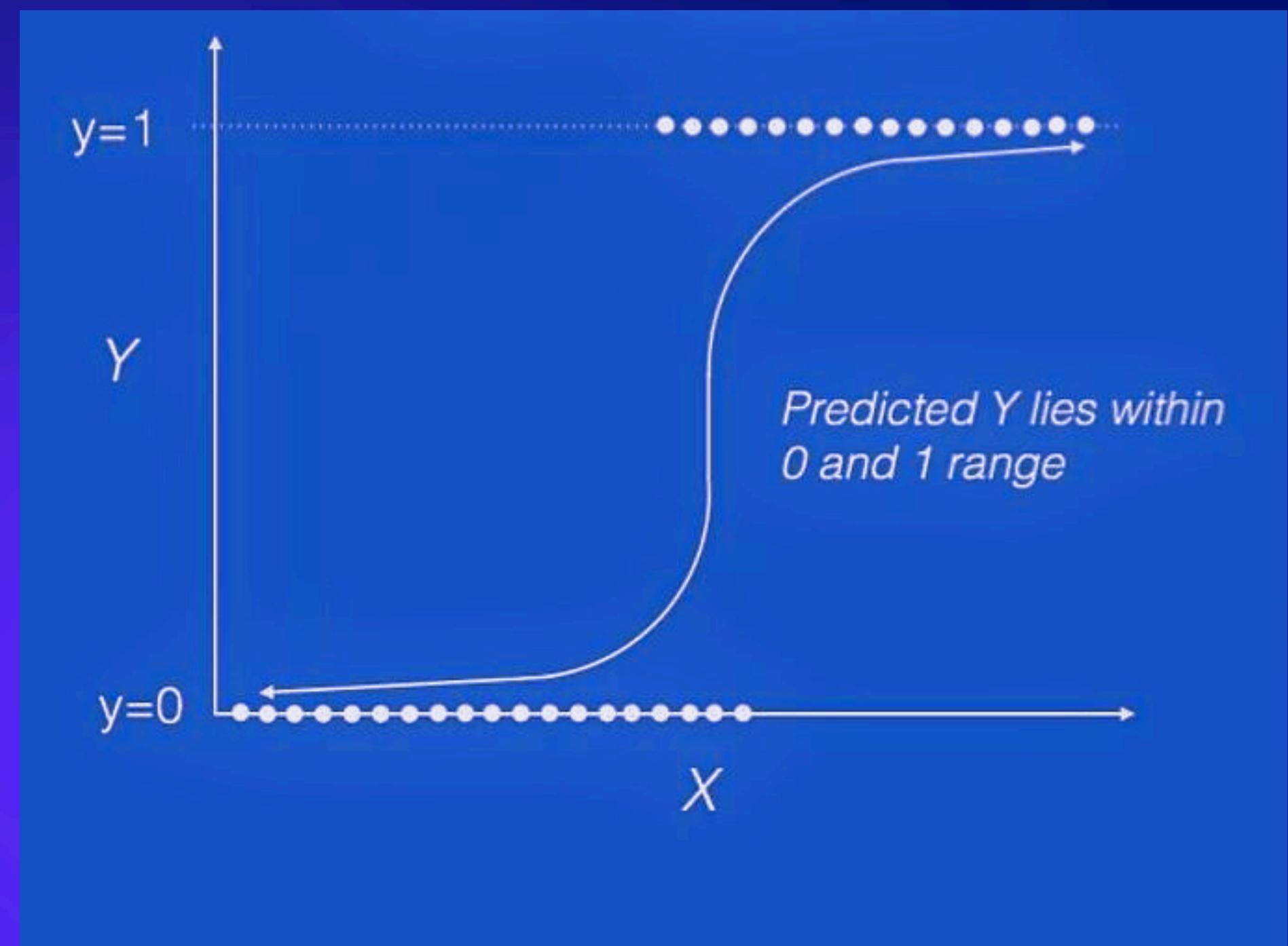
Drug dosage vs BP



Fertilizer vs Crop Yield

LOGISTIC REGRESSION

Logistic Regression is used to generate a “yes” or “no” type response based on independent variables.



LOGISTIC REGRESSION APPLICATIONS



Customer Usage Probability



Spam Likelihood

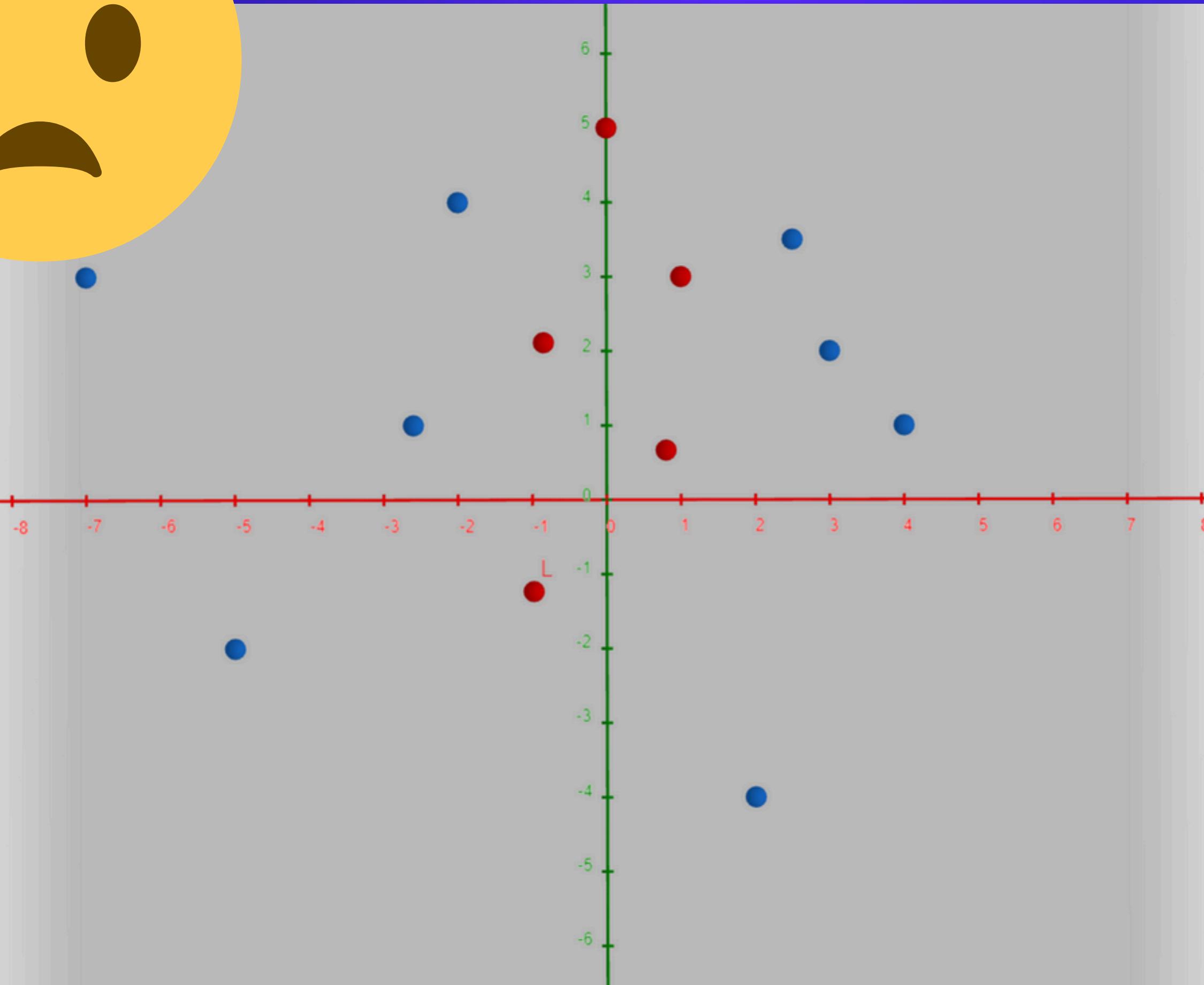


Disease Risk Chance

WOW!

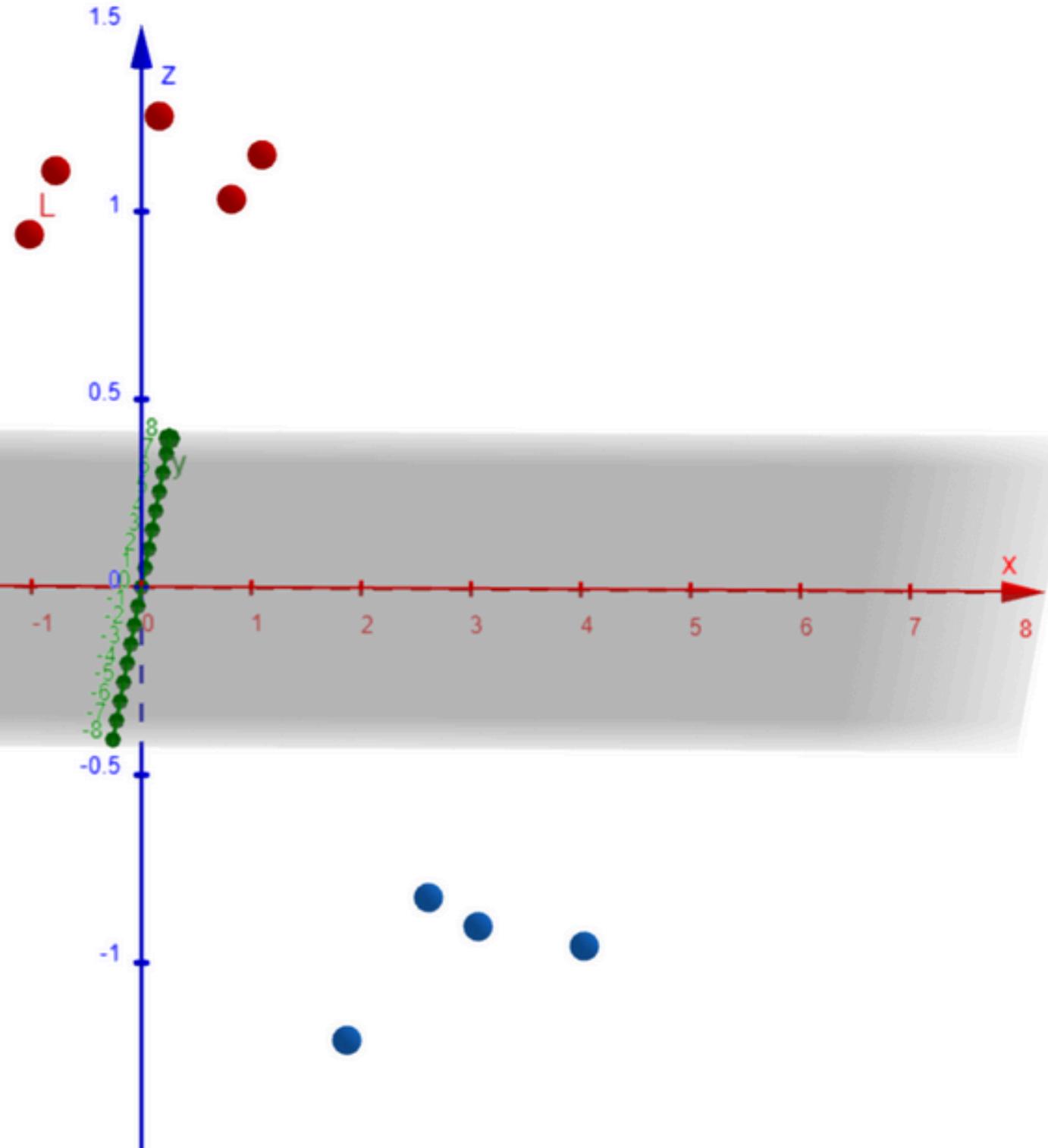
SVM

SVM





SVM



SVM USE CASES

CLASSIFICATION

FAST

GOOD WITH HIGH DIMENSIONALITY

- Fraud Detection
- Google Image Classification
- Recommender Systems
- Text Classification
- Sentiment Analysis
- Handwriting Recognition
- Flower Classification
- Fortnite Win Prediction
- Gmail Classification
- Among Us Imposter Detection

...

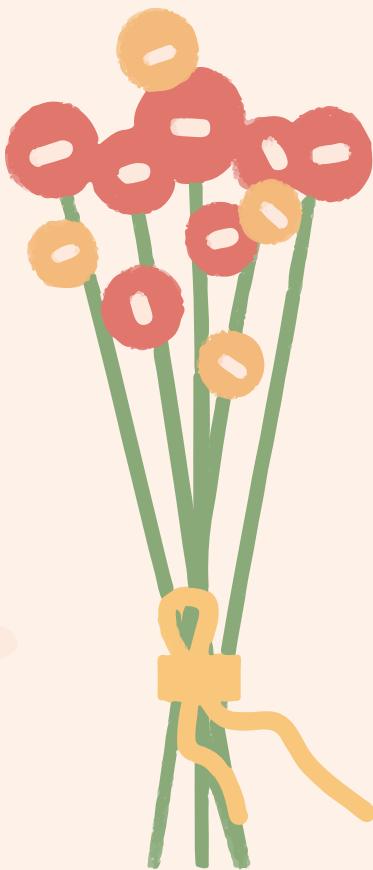
THANK YOU!





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Session #2
Whitebox Models
(continued)



AGENDA

Decision Trees

Applications of Decision Trees

K-means Clustering

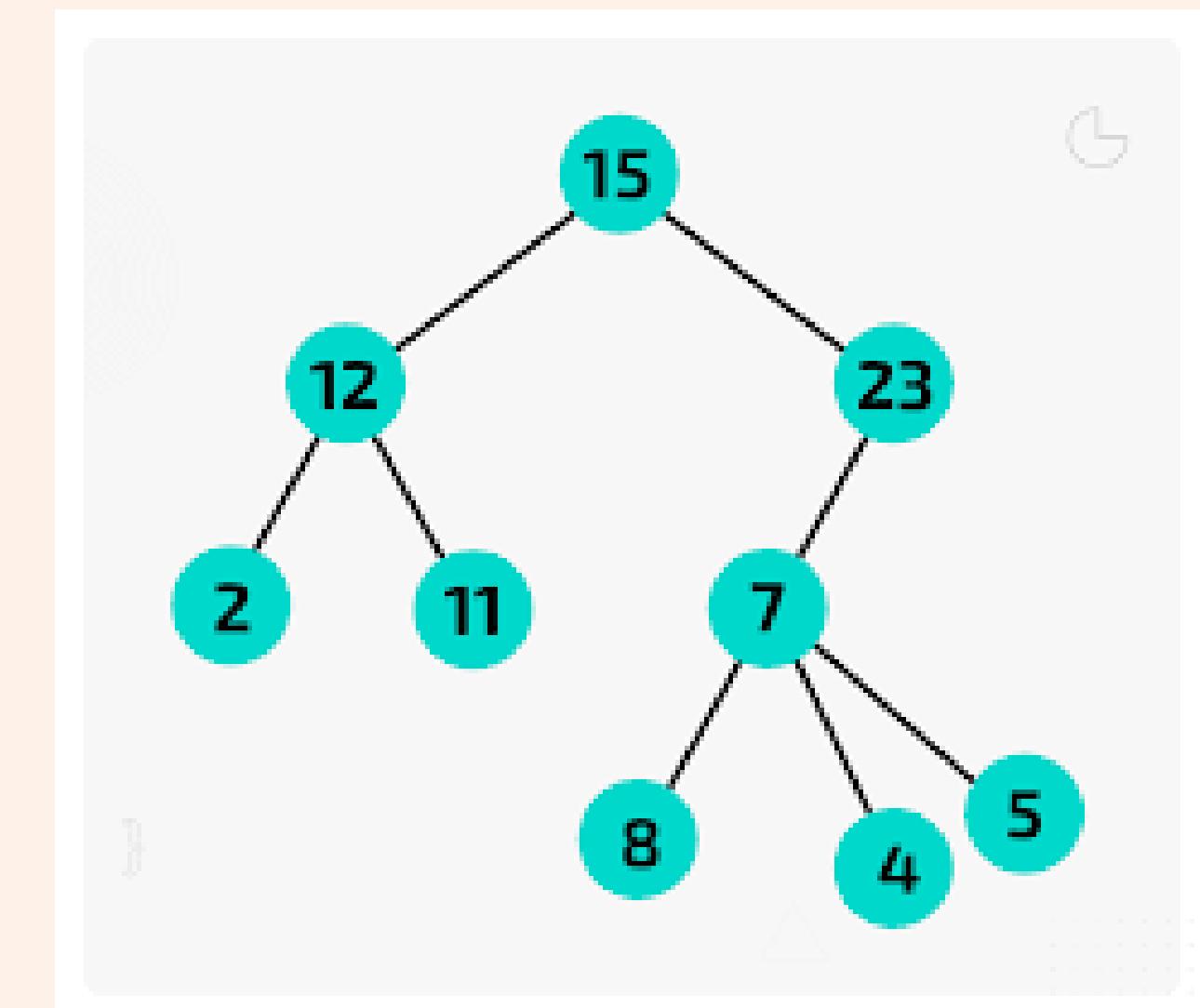
Applications of K-means clustering

Decision Trees



What are decision trees?

Decision trees is a machine learning algorithm that uses a tree structure



Should you study For your midterm?

Is the class PHYS 211?

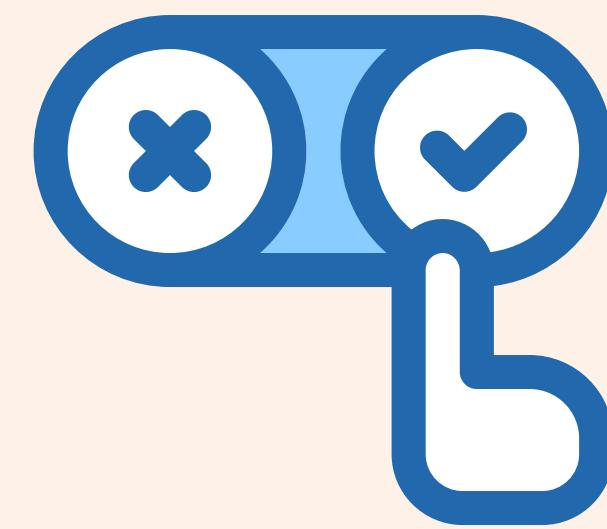
Are you the goat?

No

No

Yes

Applications of decision trees



Decision Making



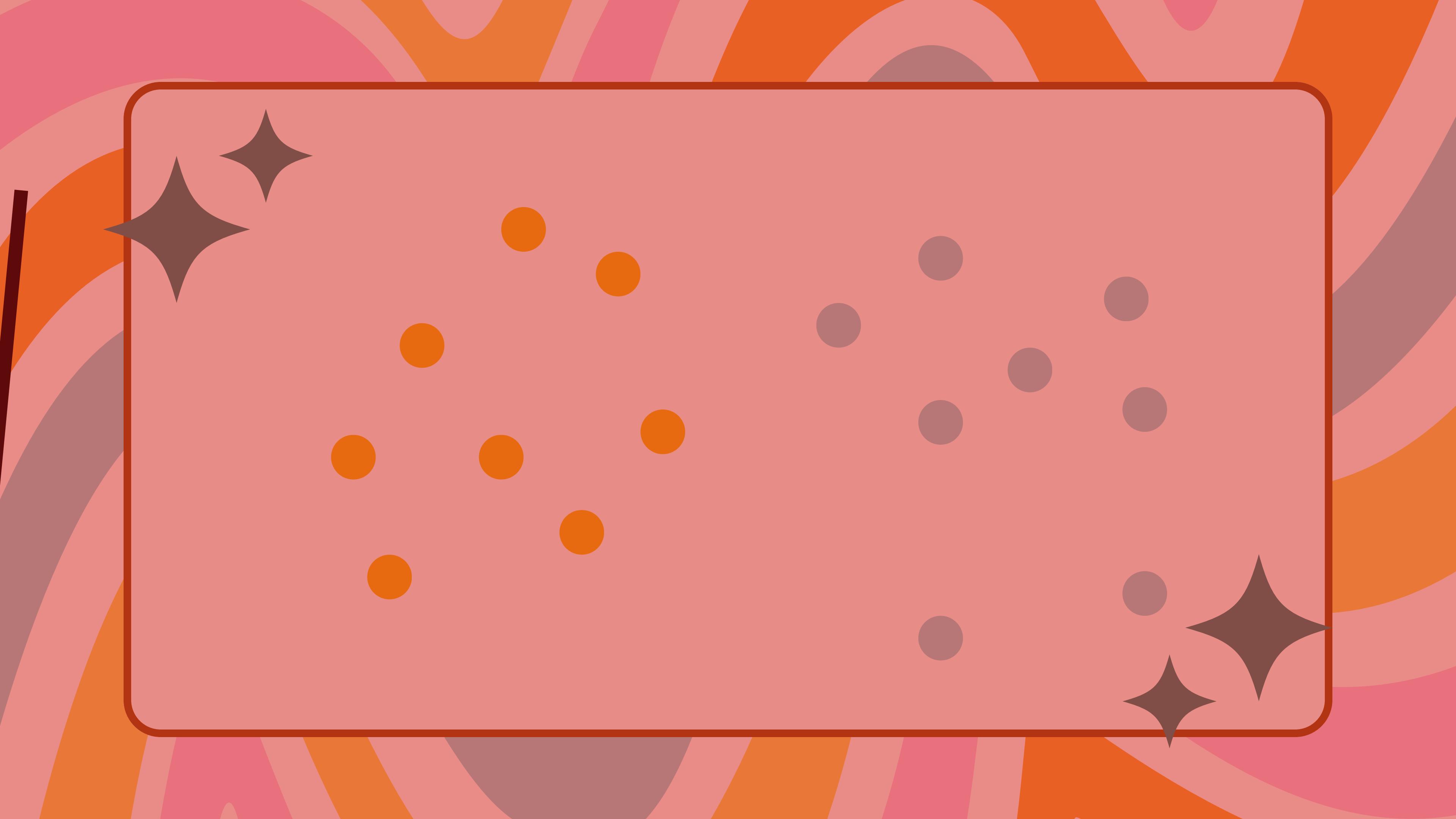
Classifying Diseases

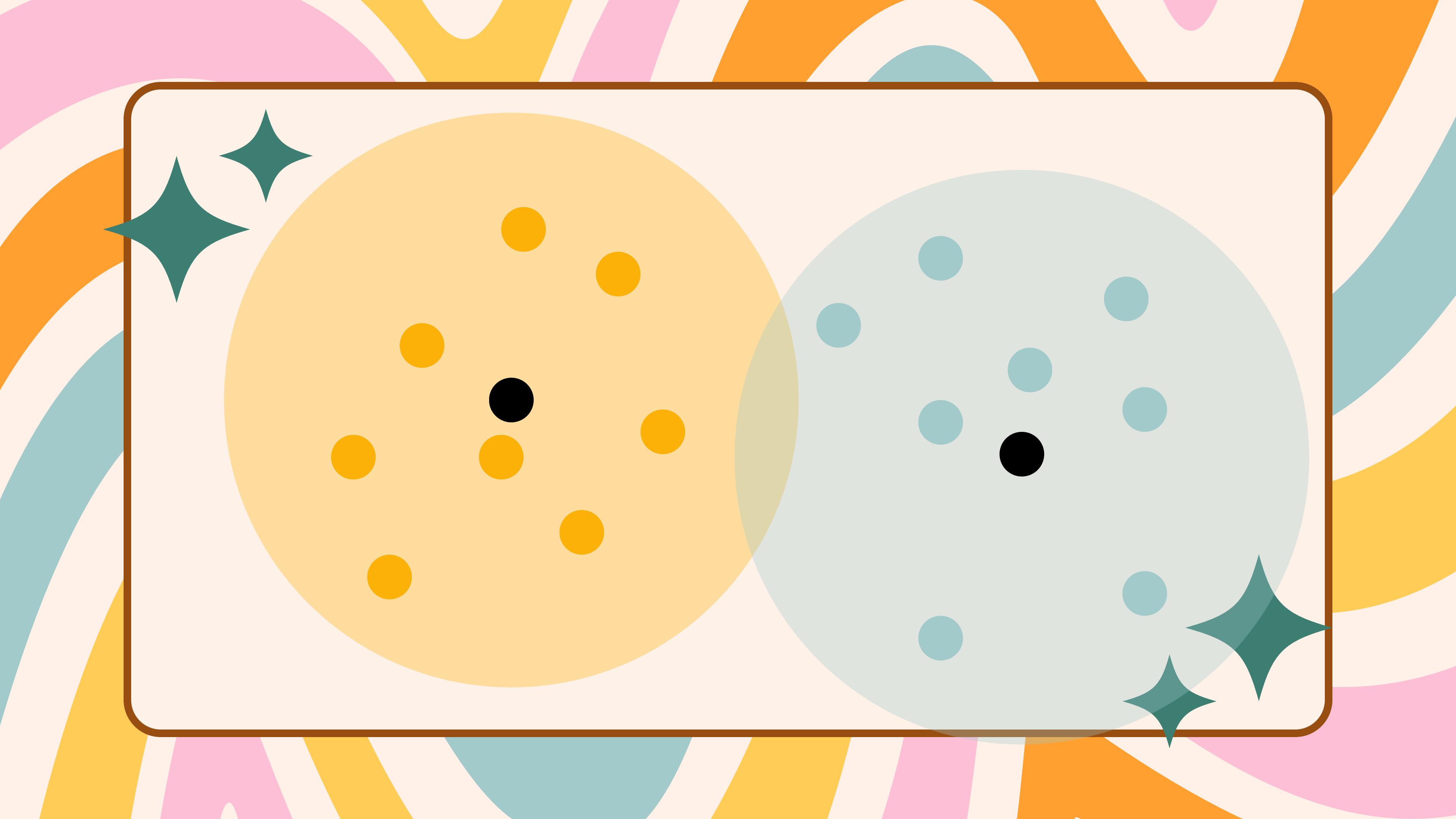


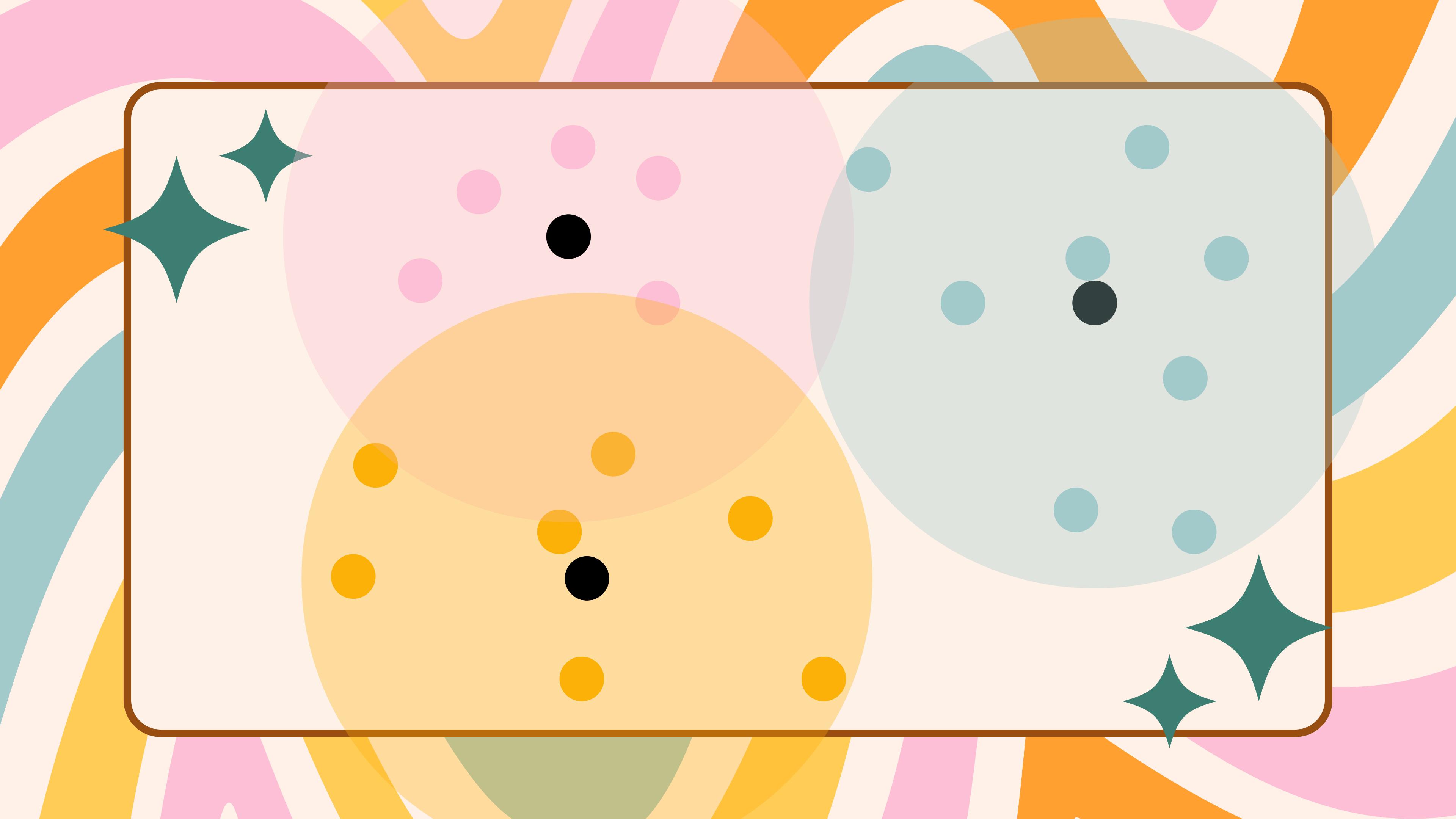
Quality Control

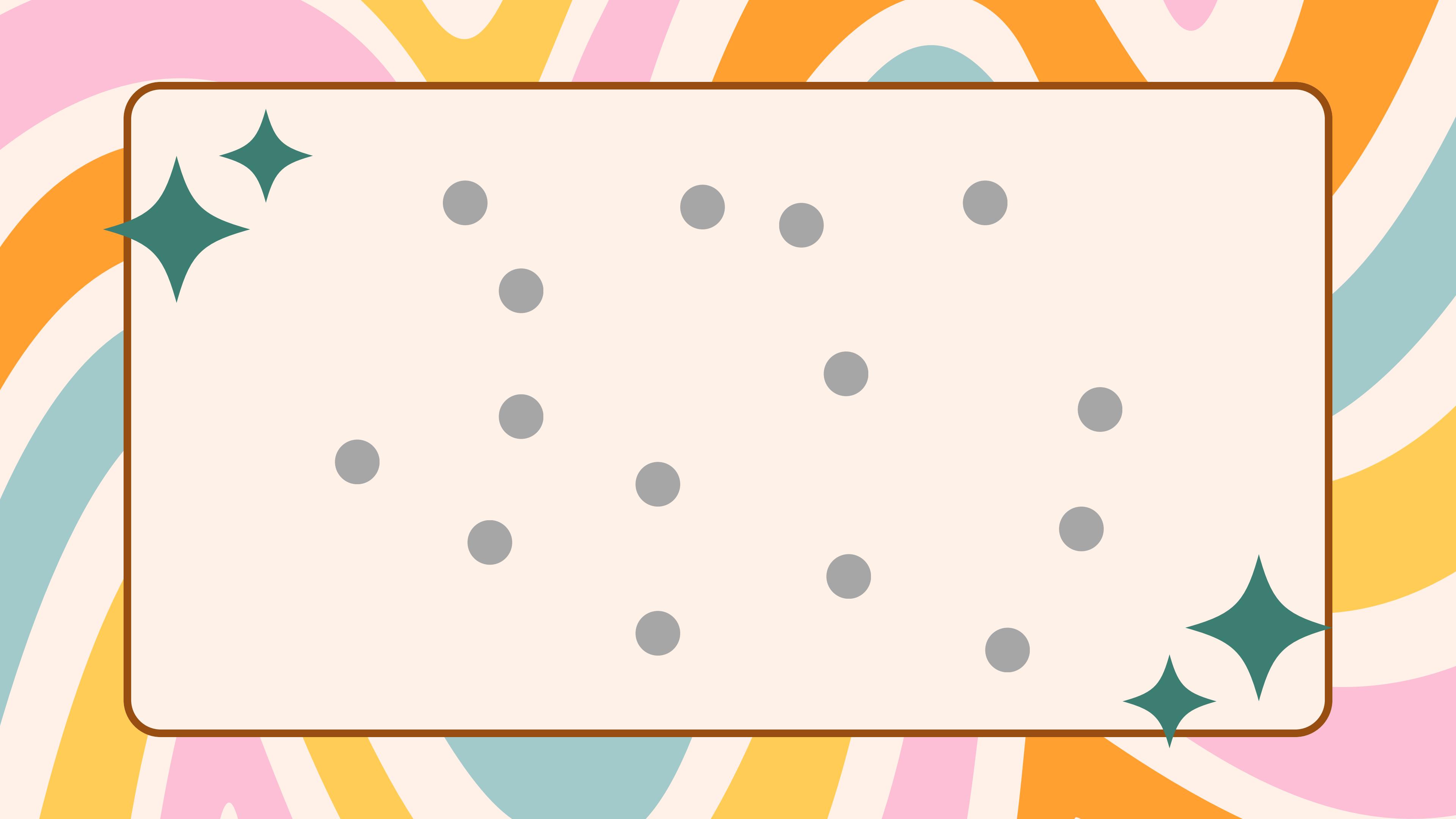
K-means clustering

Eric Farrall









Thank
you!

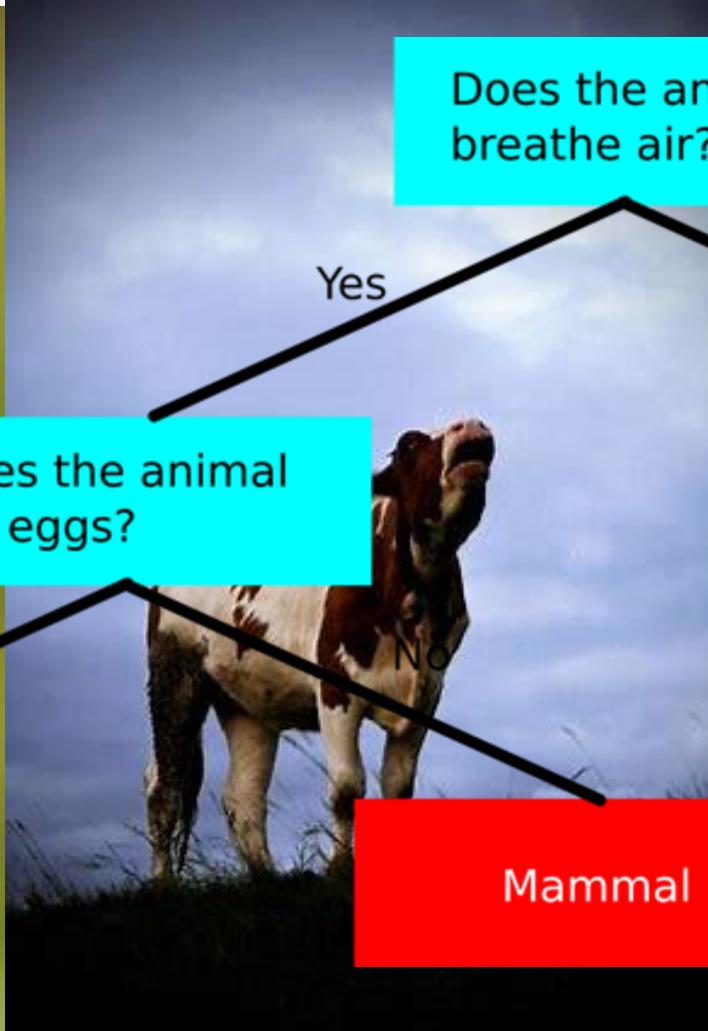
A photograph of a dense forest, likely a temperate rainforest, featuring tall, straight evergreen trees with dark brown trunks and green needles. The forest floor is covered in a thick layer of green moss and ferns, creating a lush, textured carpet. The lighting is soft, filtering through the canopy above.

RANDOM FOREST



Does the animal
lay eggs?

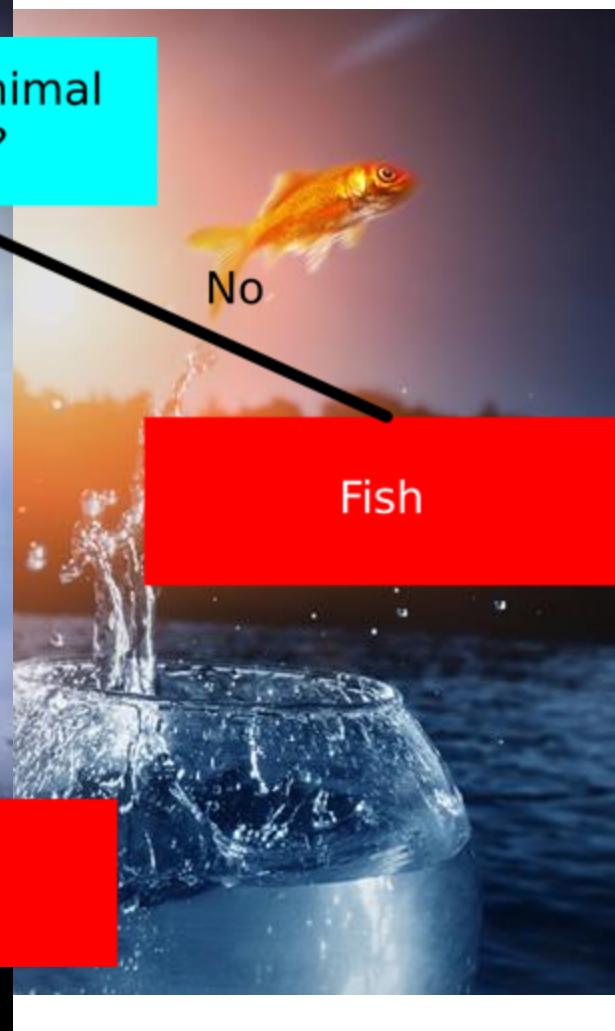
Bird



Does the animal
breathe air?

Yes

Mammal



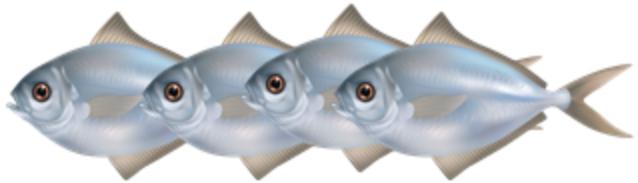
Fish

No

Messy



Good



Good

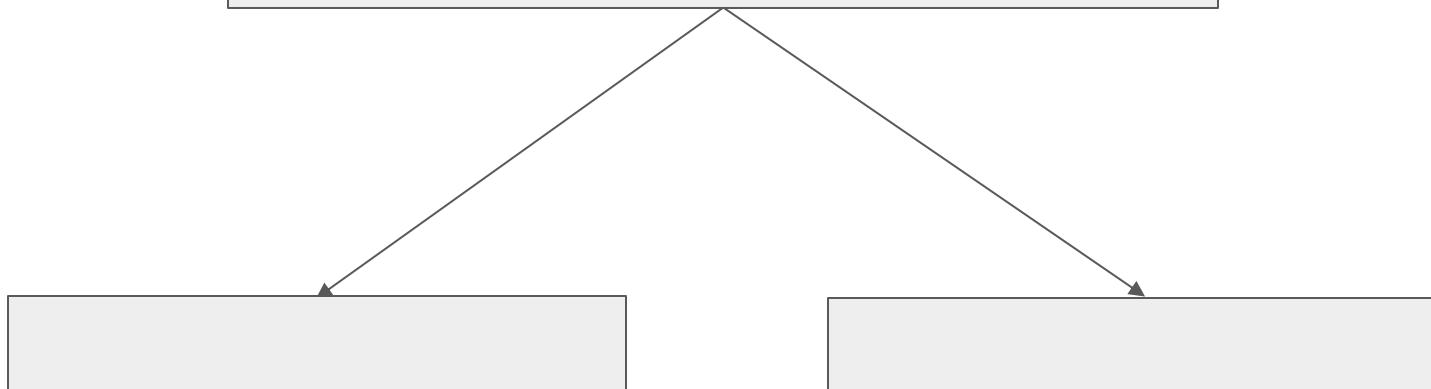


Good



2 features:
Does it Breath; Does it lay Eggs

Best Question?





Bird

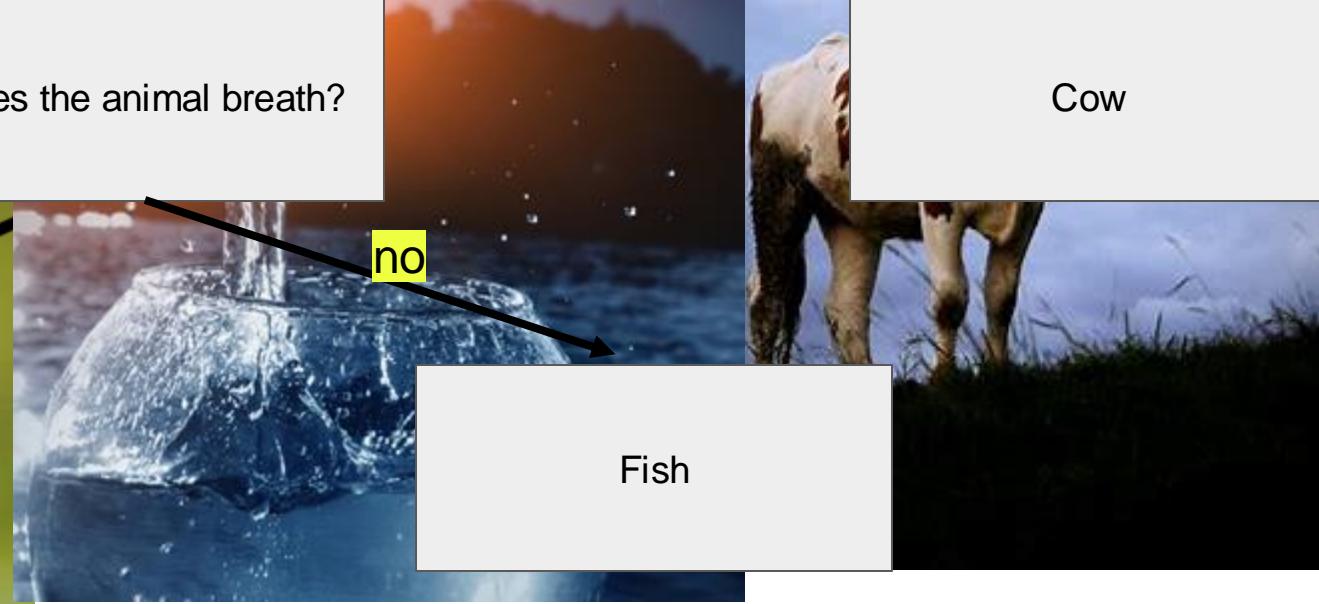


Does the animal lay eggs?

yes

Does the animal breath?

Yes



Cow



Fish

no

No

What animal?



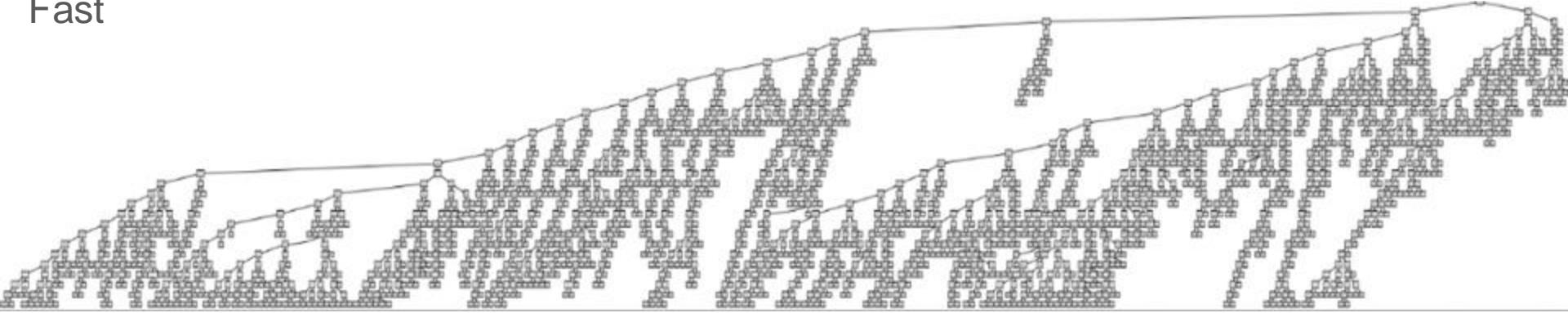
7 votes for fish
4 votes for cow
1 vote for bird



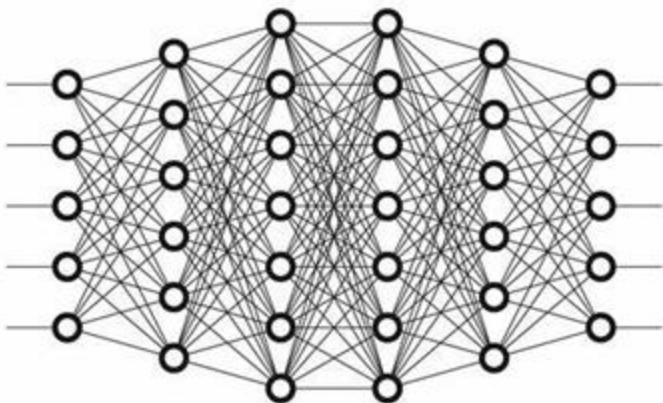
fish



Fast



Slow (to train)



Why
Train once (Top to bottom
Data doesn't slow it (much)

Pros

Fast

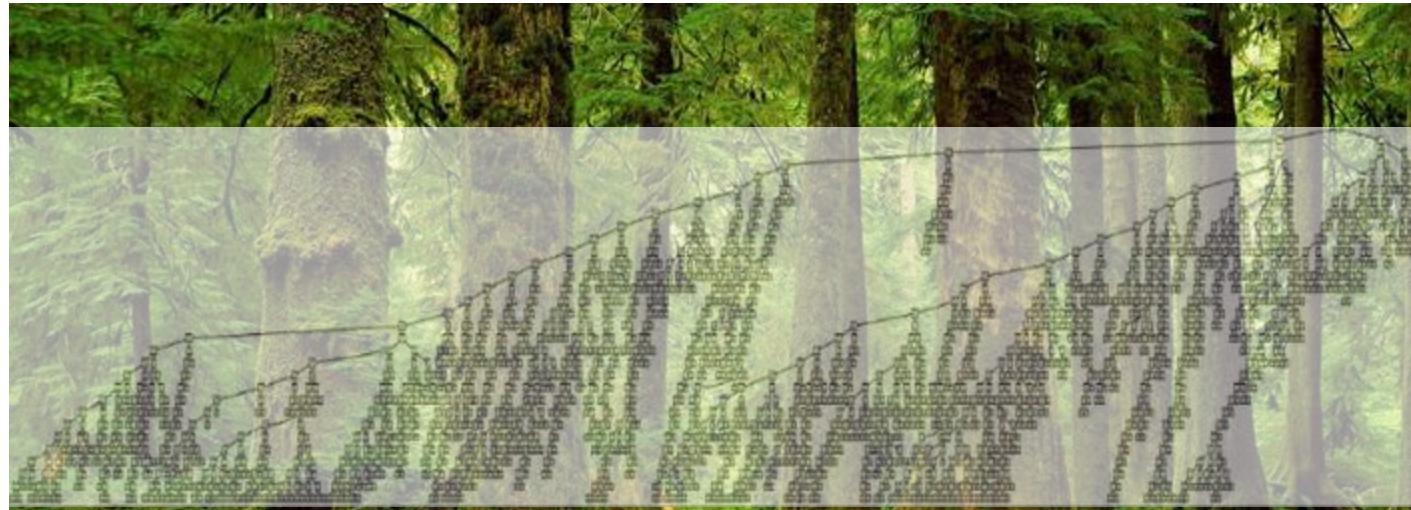
Readable (kinda)

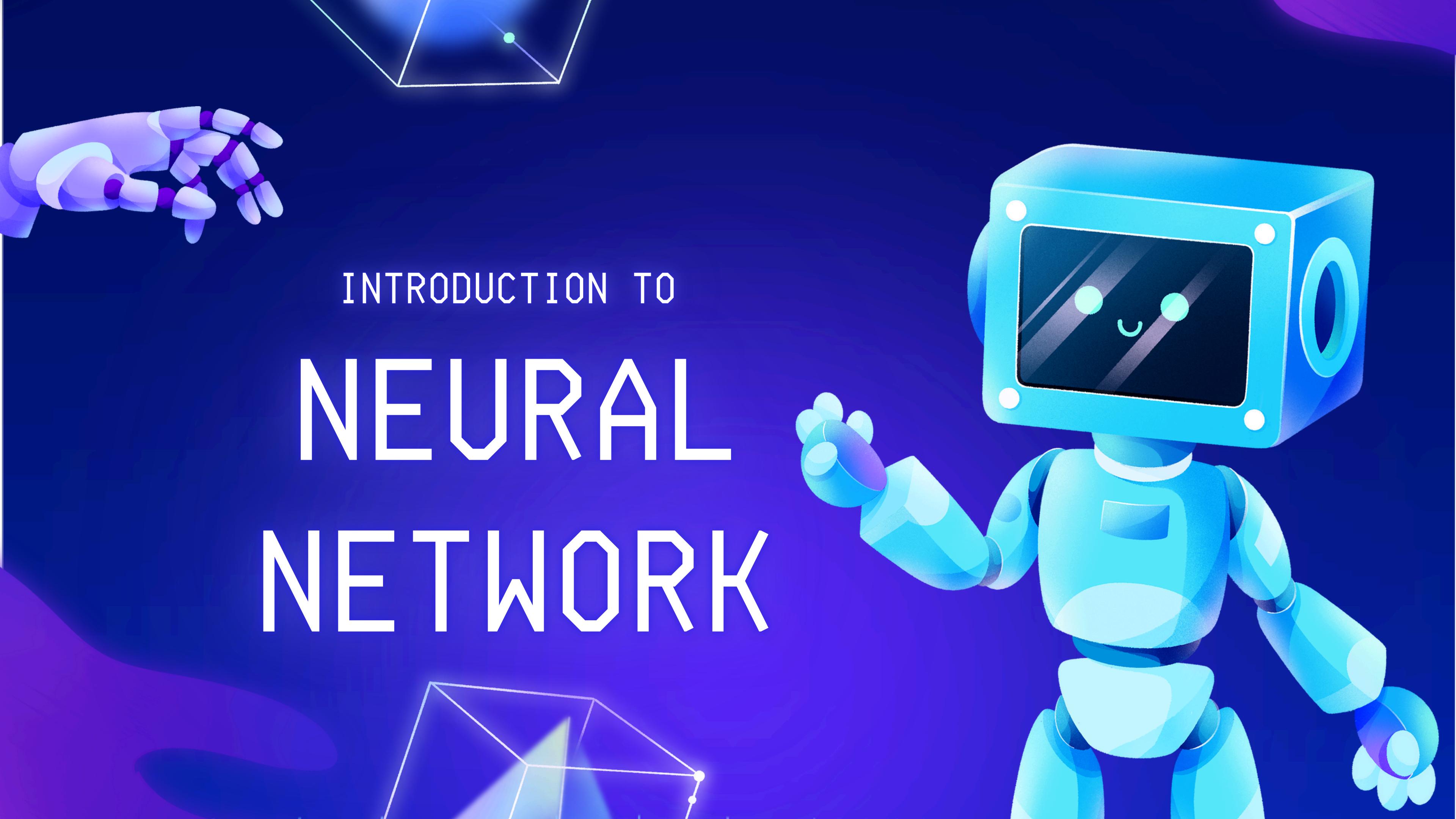
Good for structured data

Bads

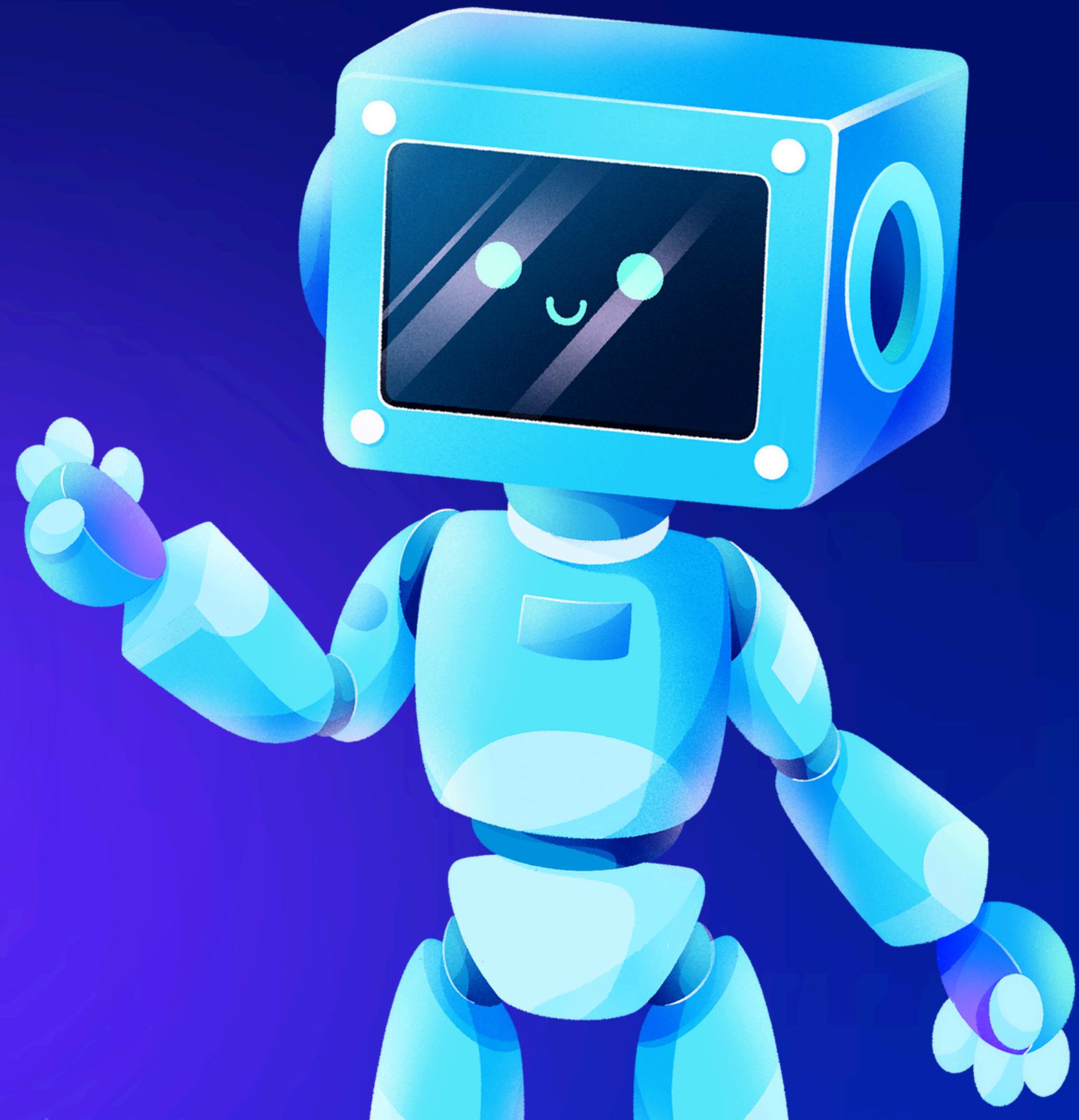
Unstructured data (what is a pixel?)

Doesn't run much faster than others

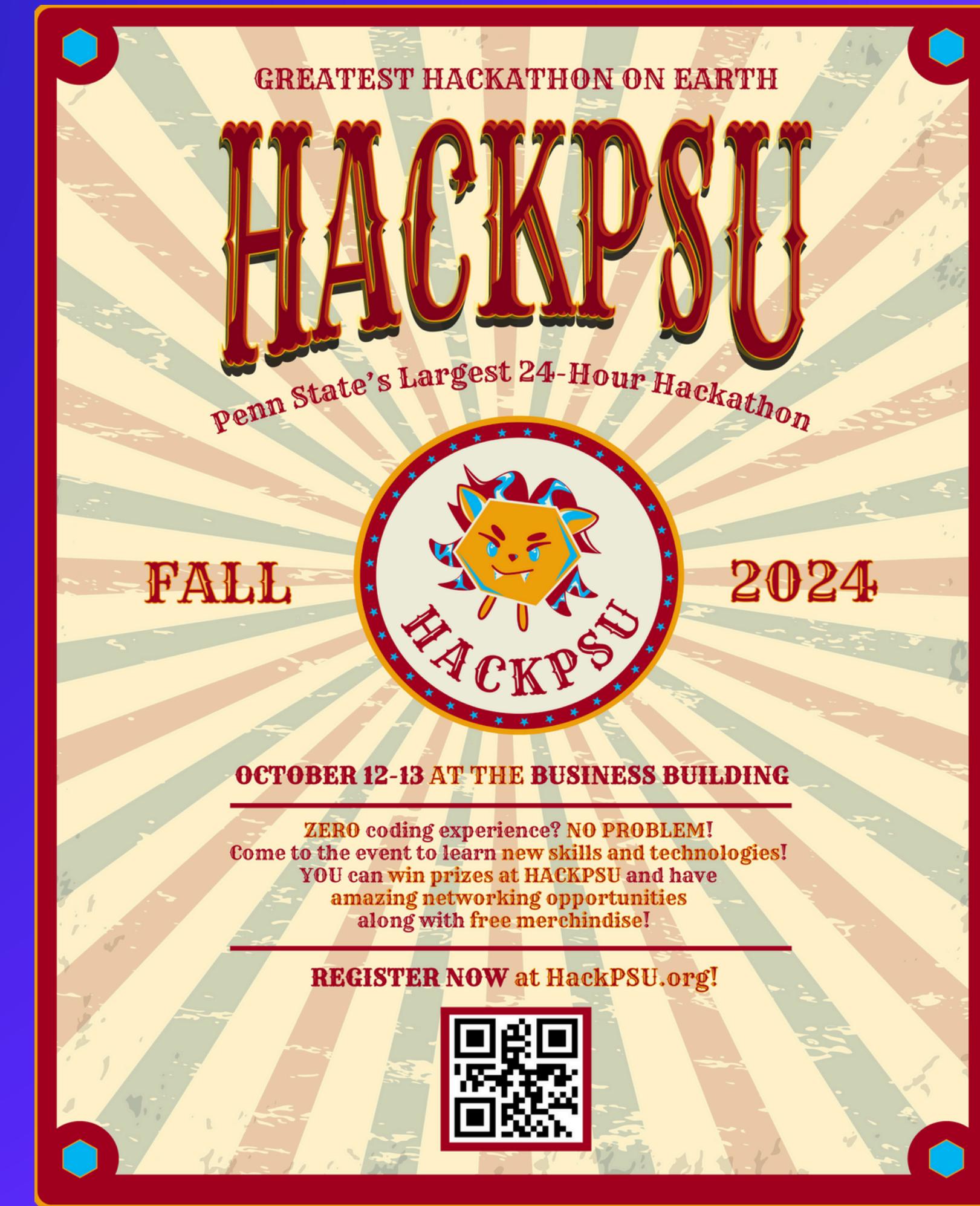




INTRODUCTION TO NEURAL NETWORK



REGISTER



INSTAGRAM



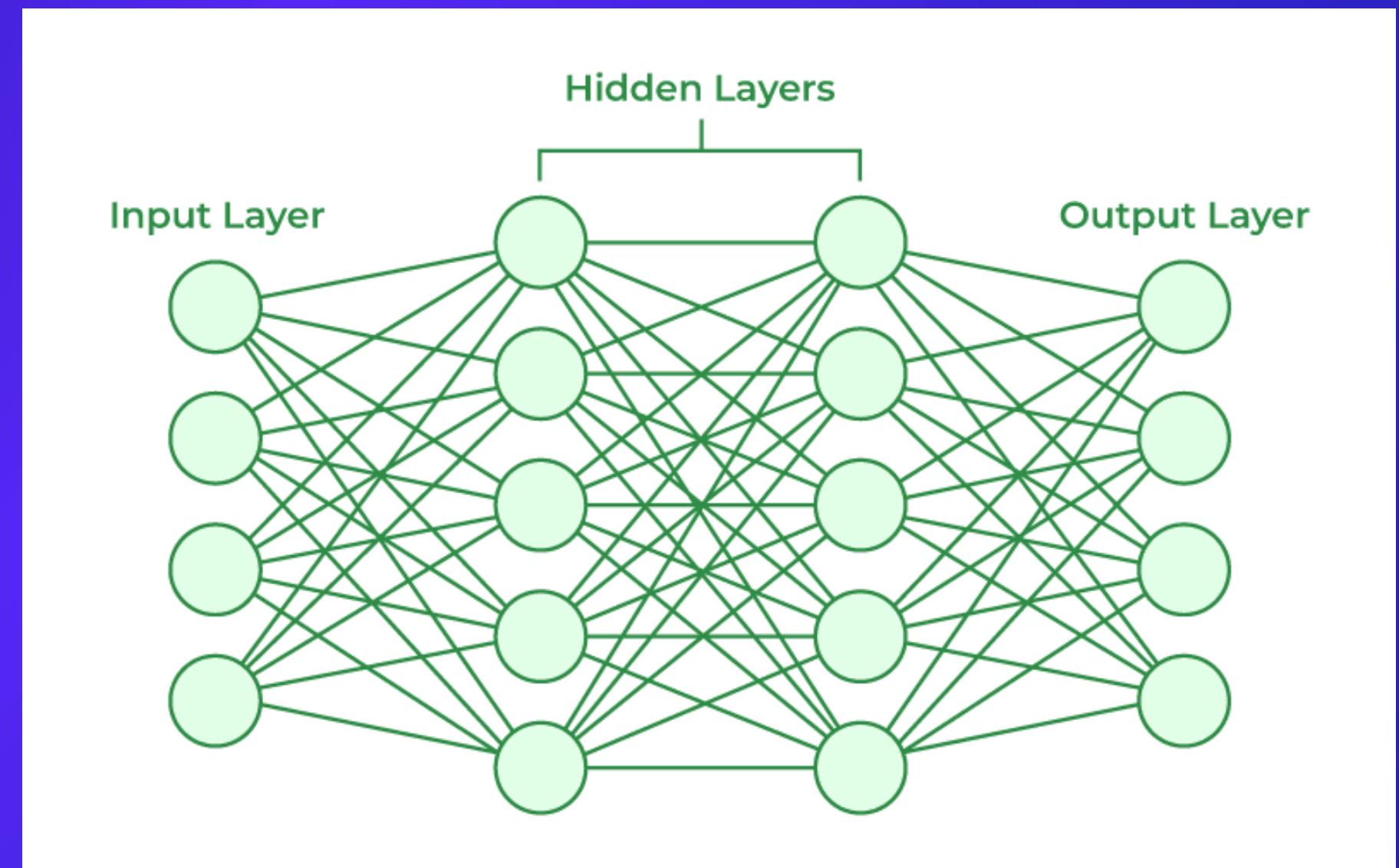
Agenda

- What is **Neural Network**
- Understanding **Weights** and **Biases**
- The **Feedforward Process**
- **MNIST** Dataset Overview
- Activation Function



What is a Neural Network?

- Inspired by the human brain
- Processes information in layers
- image classification, language translation, and more



Weights and Biases

Weight: Weights are numbers in the network that show how important each connection between neurons is..

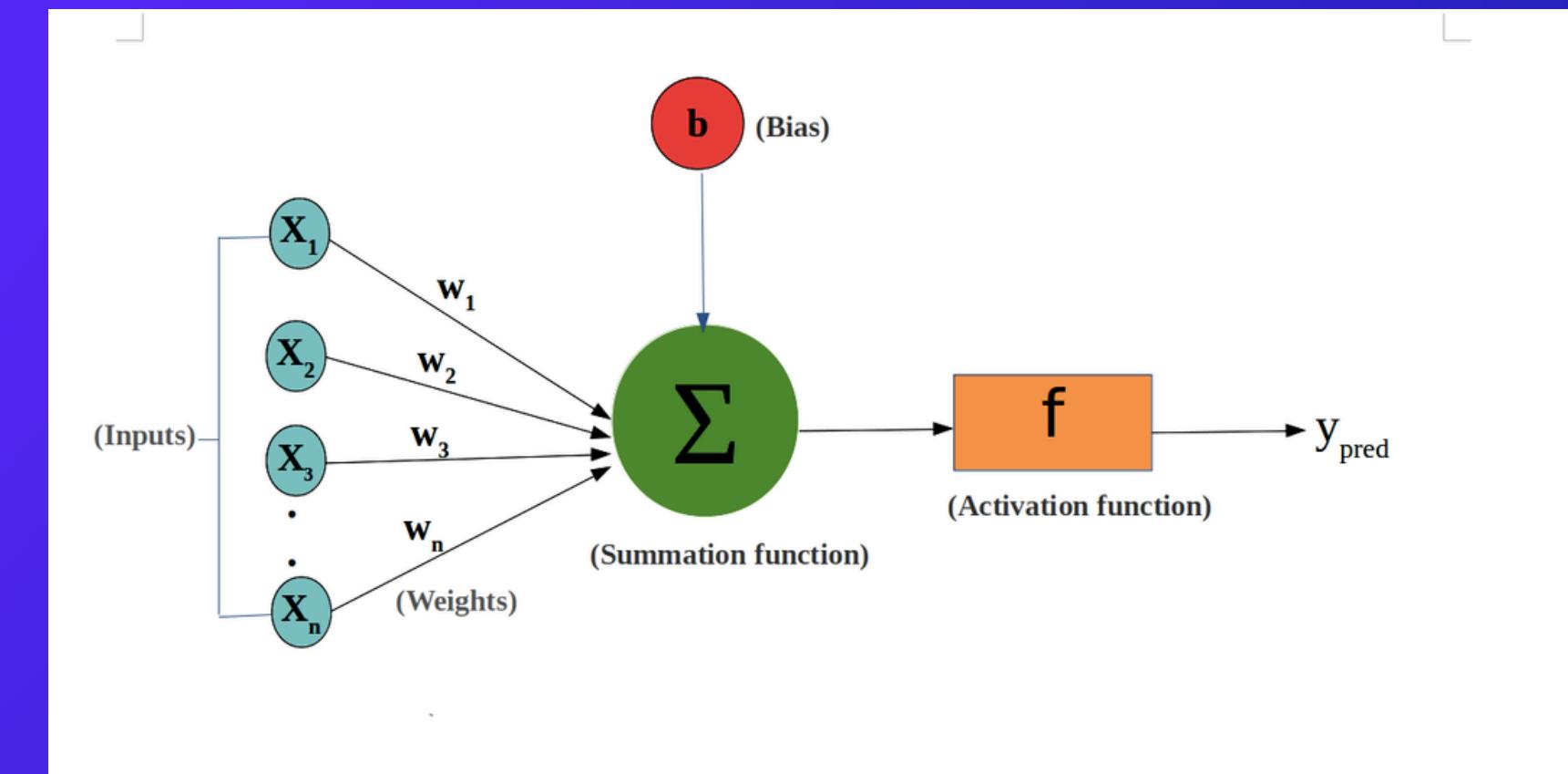
Bias: Bias is a number added to the result that helps the network make better decisions, even if all the inputs are zero.

Housing Price prediction Dataset

Weight : the size of the house

Bias : the location of the house

The number of the weight and bias are learned from **Backpropagation**



Questions ?

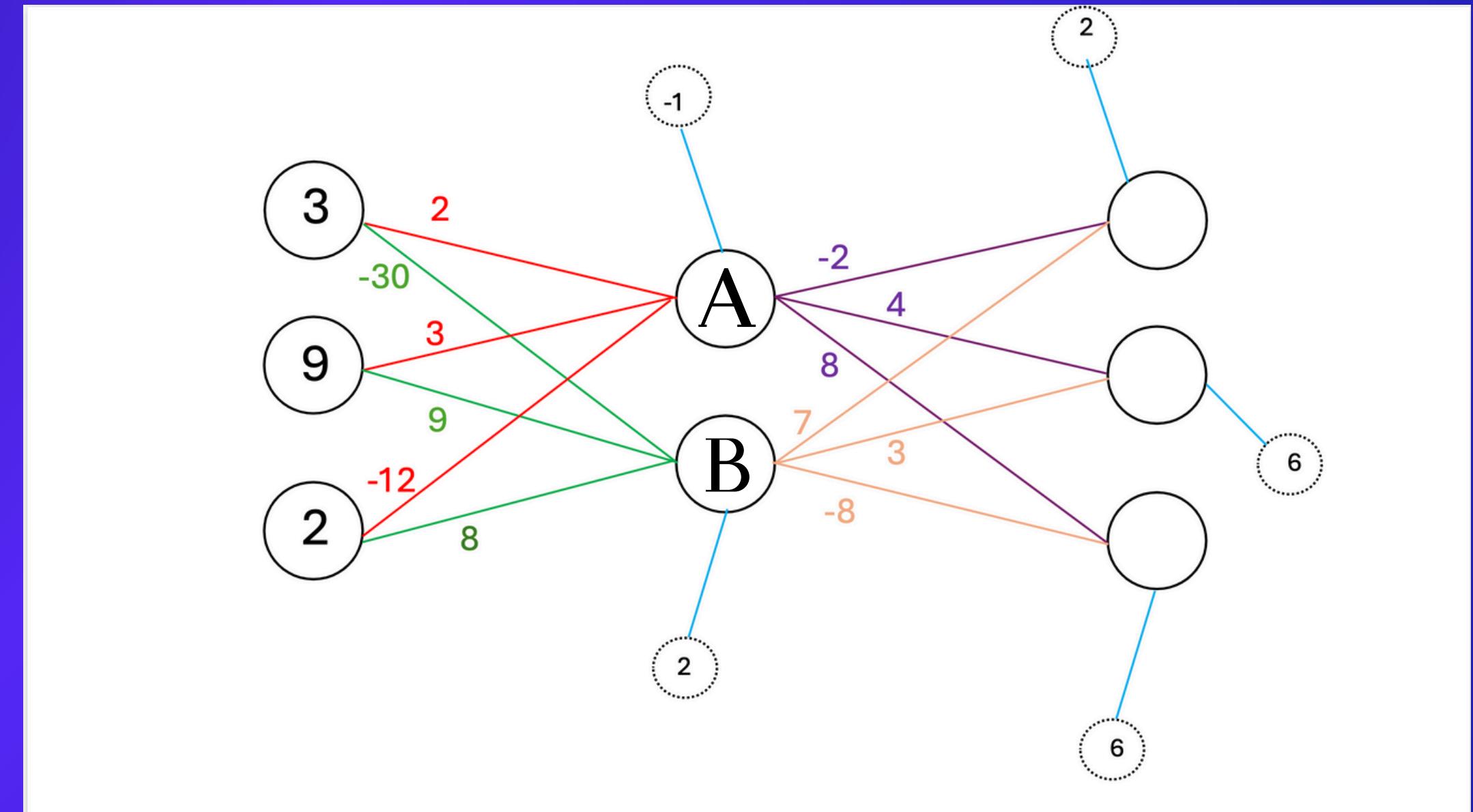
- What is neural network
- Understanding Weights and Biases
- The Feedforward Process
- MNIST Dataset Overview
- Activation Function

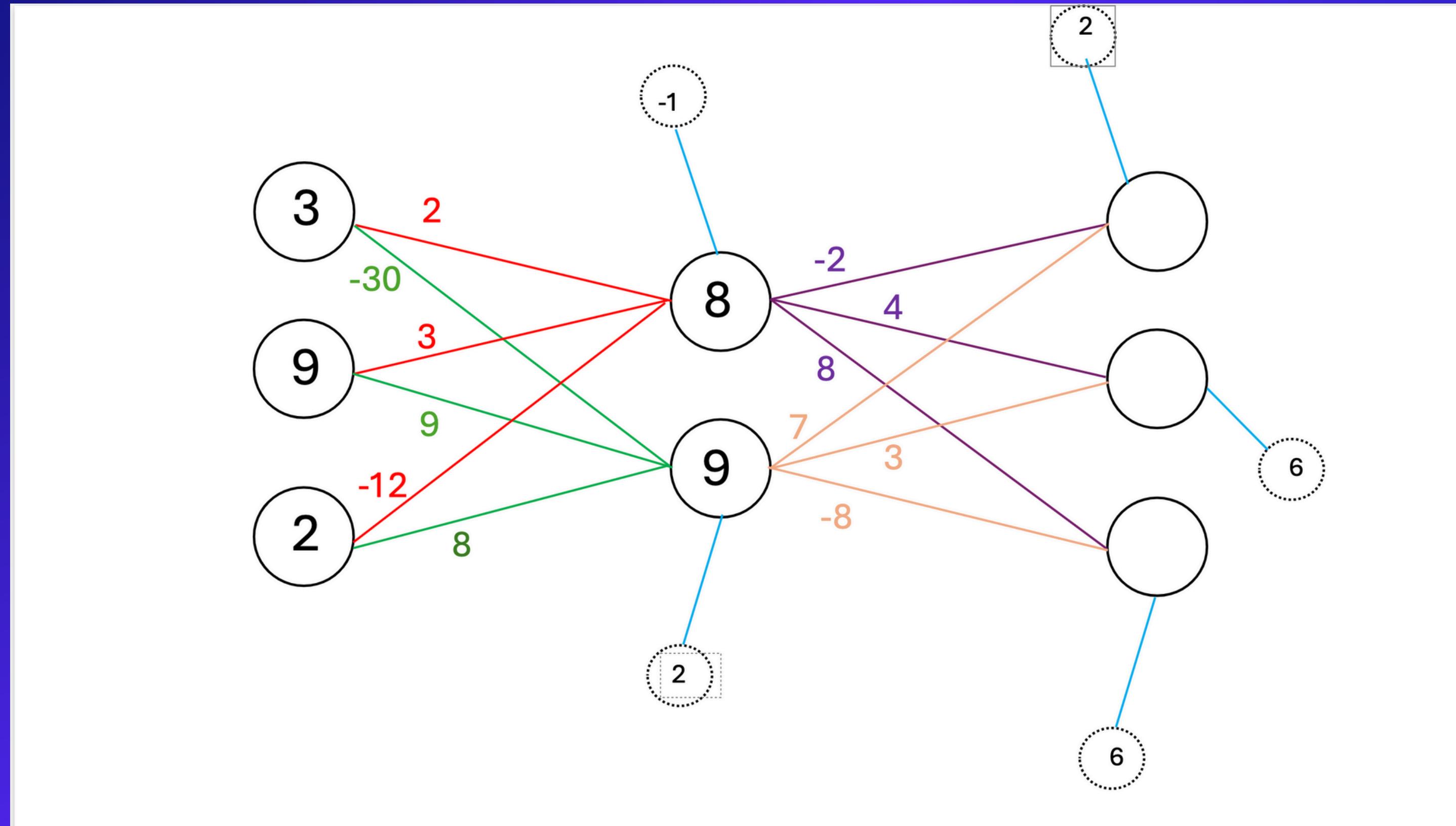
Weights and Bias Example

- Formula: $Z = w_1 * x_1 + w_2 * x_2 + \dots + w_n * x_n + b$

- **z** is the output or result
- **w** is the weight
- **x** is the input value
- **b** is the bias

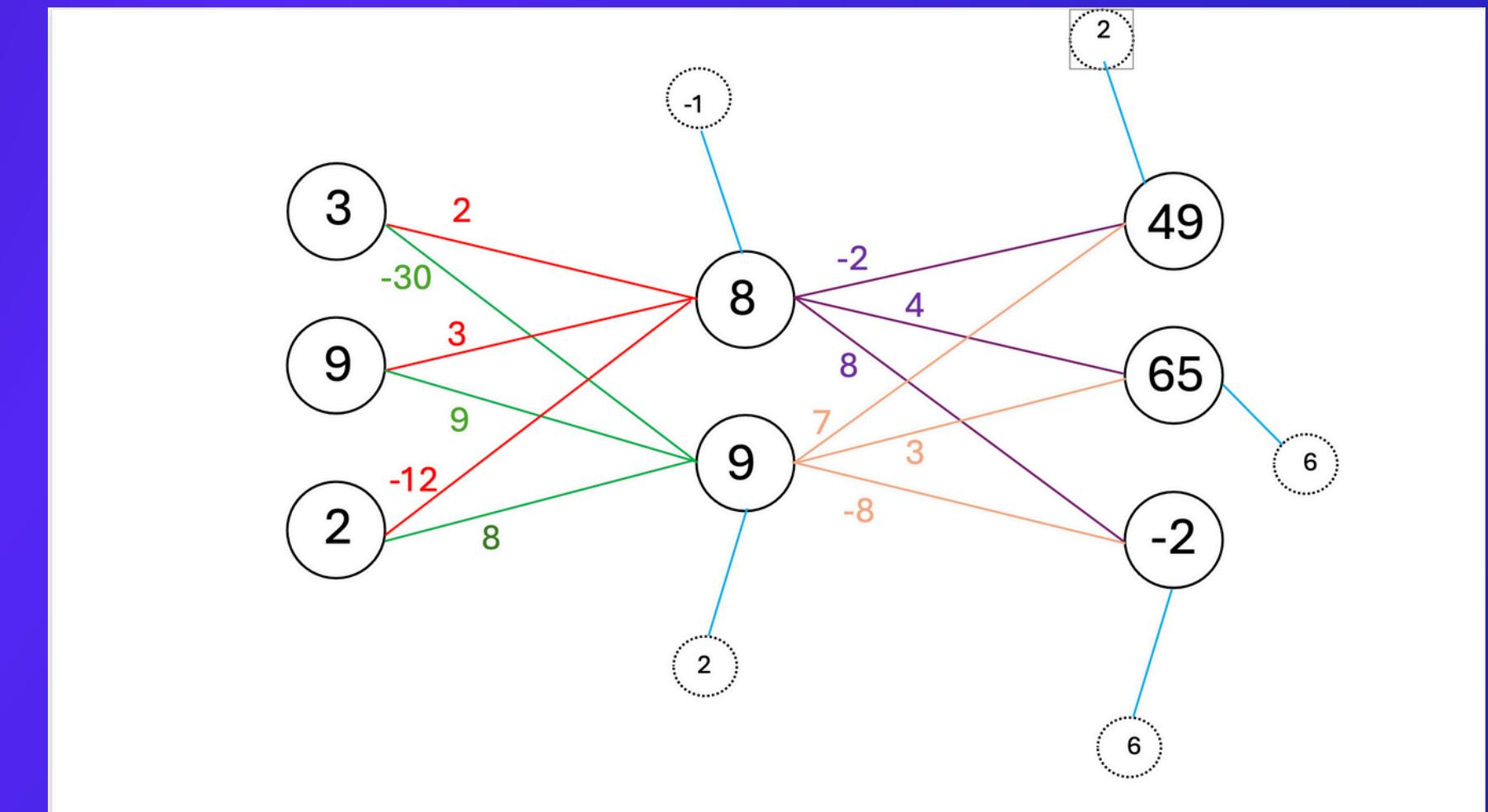
What is the activation number
for A and B?





The Feedforward Process

- Data moves through the network layer by layer.
- Weighted sum + bias is passed through each neuron.
- Final output: Prediction or classification.

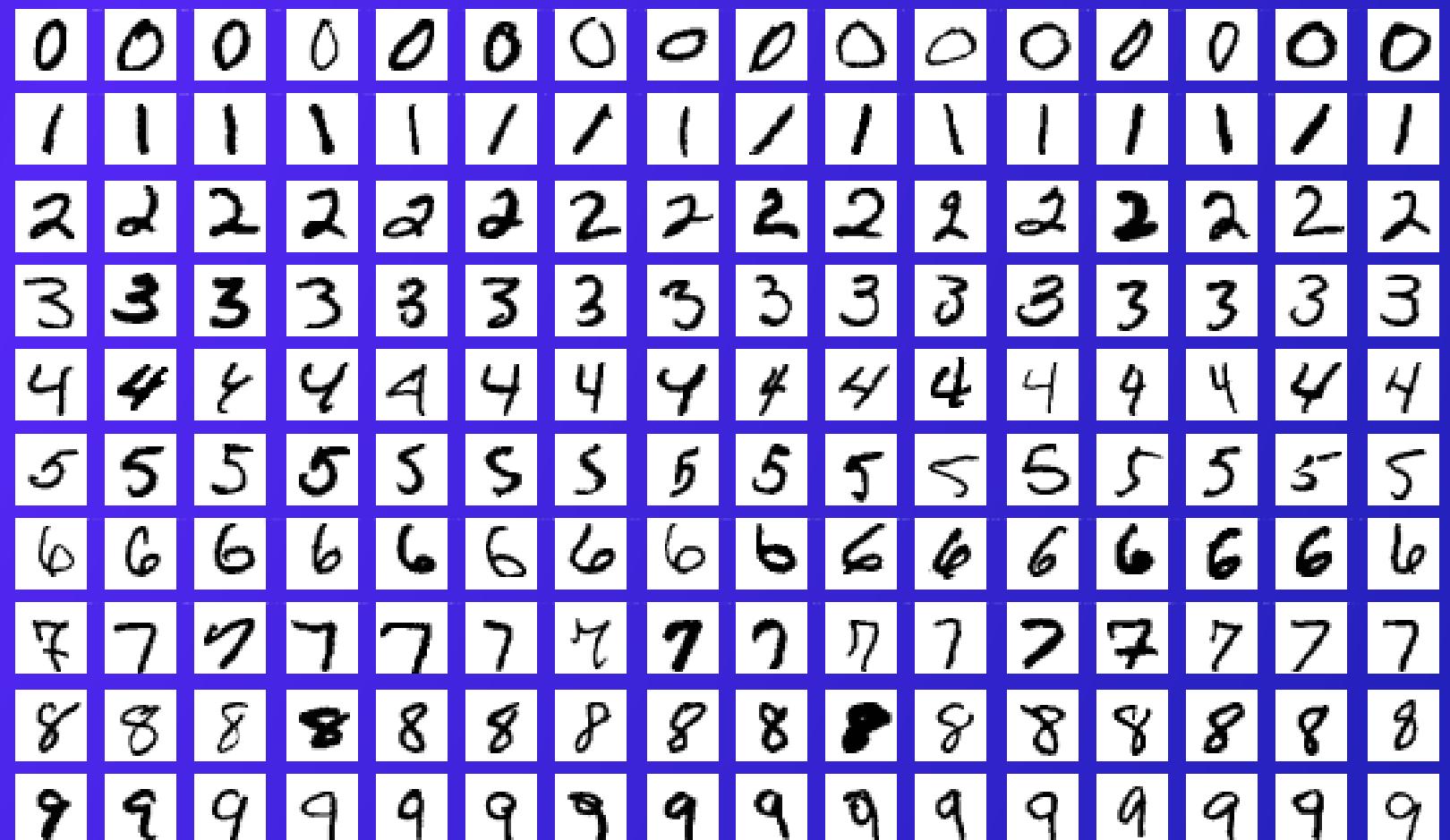


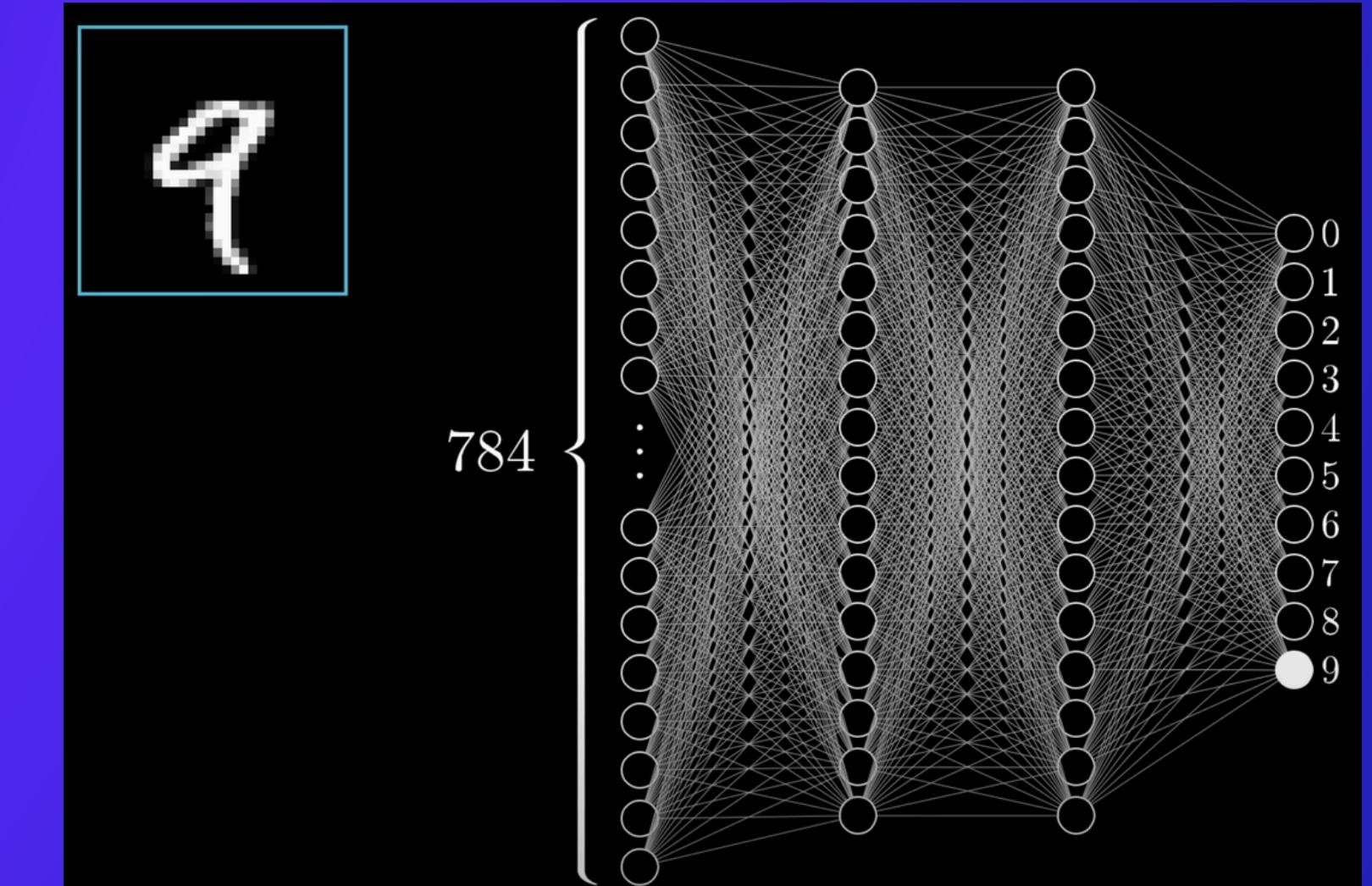
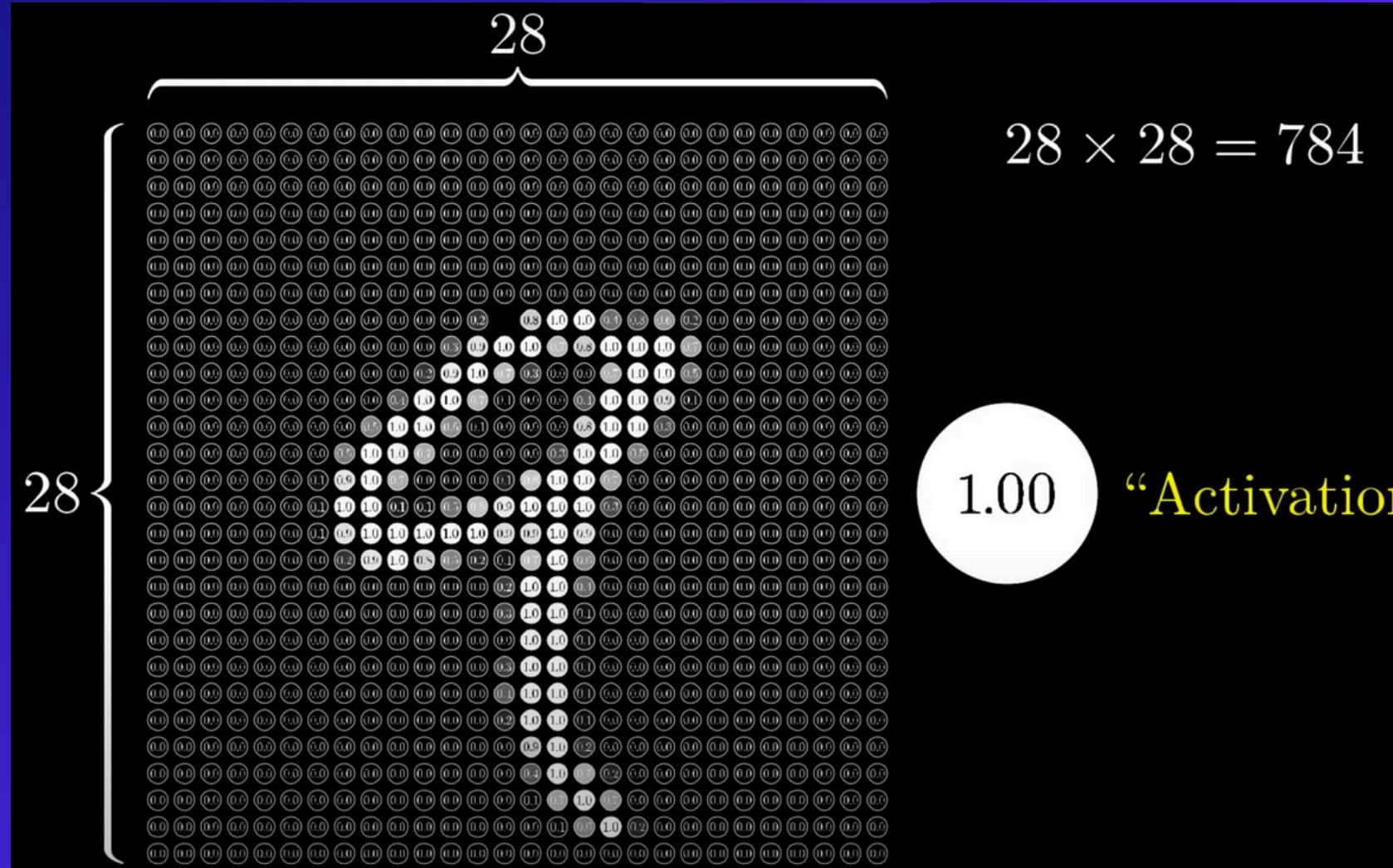
Questions ?

- What is neural network
- Understanding Weights and Biases
- The Feedforward Process
- MNIST Dataset Overview
- Activation Function

MNIST Dataset

- Collection of 70,000 handwritten digits (0-9).
- Each image is 28x28 pixels, grayscale.
- Goal: Train the network to recognize digits.





"Source: 3Blue1Brown (2017). But what is a Neural Network? [YouTube Video]. Retrieved from <https://youtu.be/aircAruvnKk>"

TensorFlow vs PyTorch

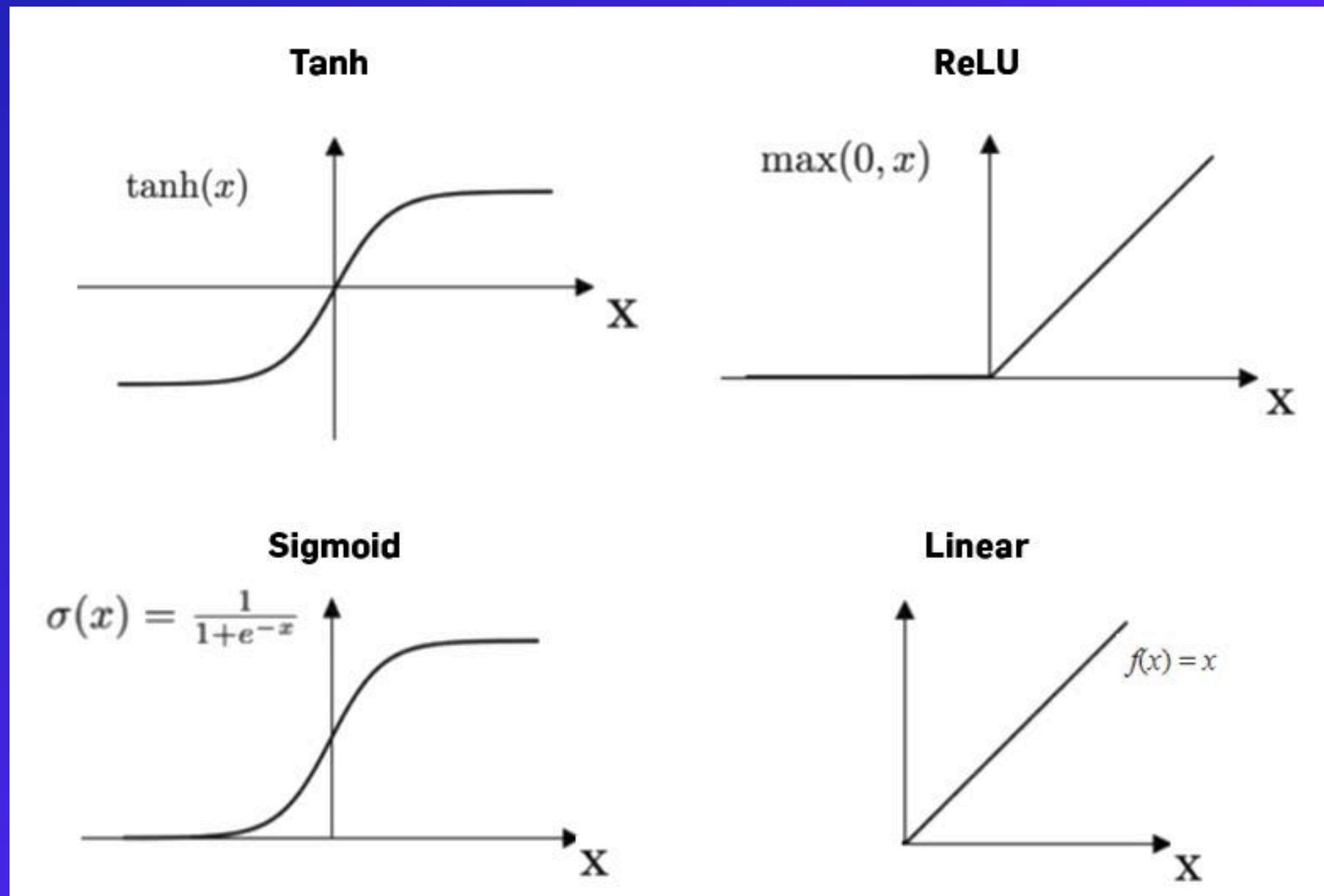
```
#TensorFlow  
#Declaring the type of model  
model = tf.keras.models.Sequential()  
  
#Adding Layers to the model  
model.add( layers.Input(np.shape(X_train)[1:]) )  
model.add( layers.Flatten() )  
model.add( layers.Dense(16, activation = 'relu') )  
model.add( layers.Dense(16, activation = 'relu'))  
  
#Final Layer, where the prediction will be made  
model.add( layers.Dense(10, activation = 'softmax') )
```

```
#PyTorch  
class Classifier(nn.Module):  
    def __init__(self, batch_size):  
        super().__init__()  
        self.dense = nn.Sequential(  
            nn.Flatten(),  
            nn.Linear(2048, 256),  
            nn.Sigmoid()  
        )  
  
        self.dense = nn.Sequential(  
            nn.Flatten(),  
            nn.Linear(256, 10),  
            nn.Sigmoid()  
        )  
  
        self.dense = nn.Sequential(  
            nn.Flatten(),  
            nn.Linear(256, 1),  
            nn.Sigmoid()  
        )  
  
        self.batch_size = batch_size  
    def forward(self, x):  
        x = self.dense(x)  
        x = self.dense(x)  
        x = self.dense(x)  
        x = self.dense(x)  
        return x.squeeze()
```

Questions ?

- What is neural network
- Understanding Weights and Biases
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Activation function

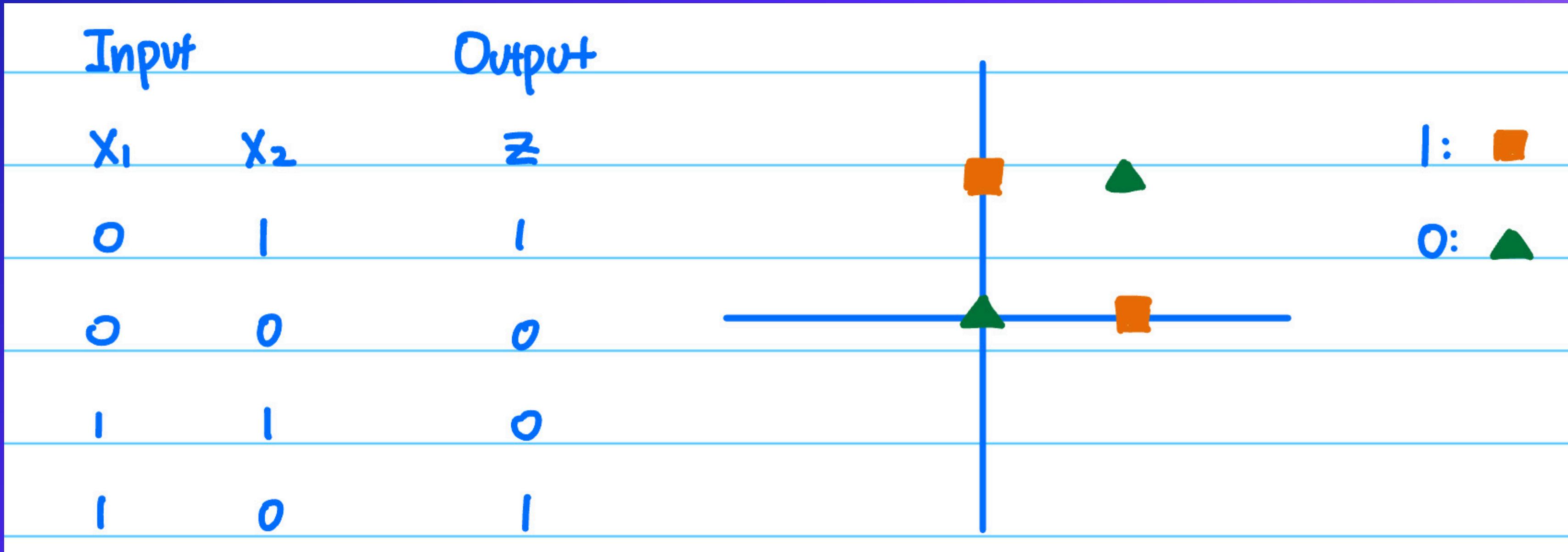


In machine learning, the **activation function** introduces **non-linearity** into the output of a neuron in a neural network

THANK YOU!

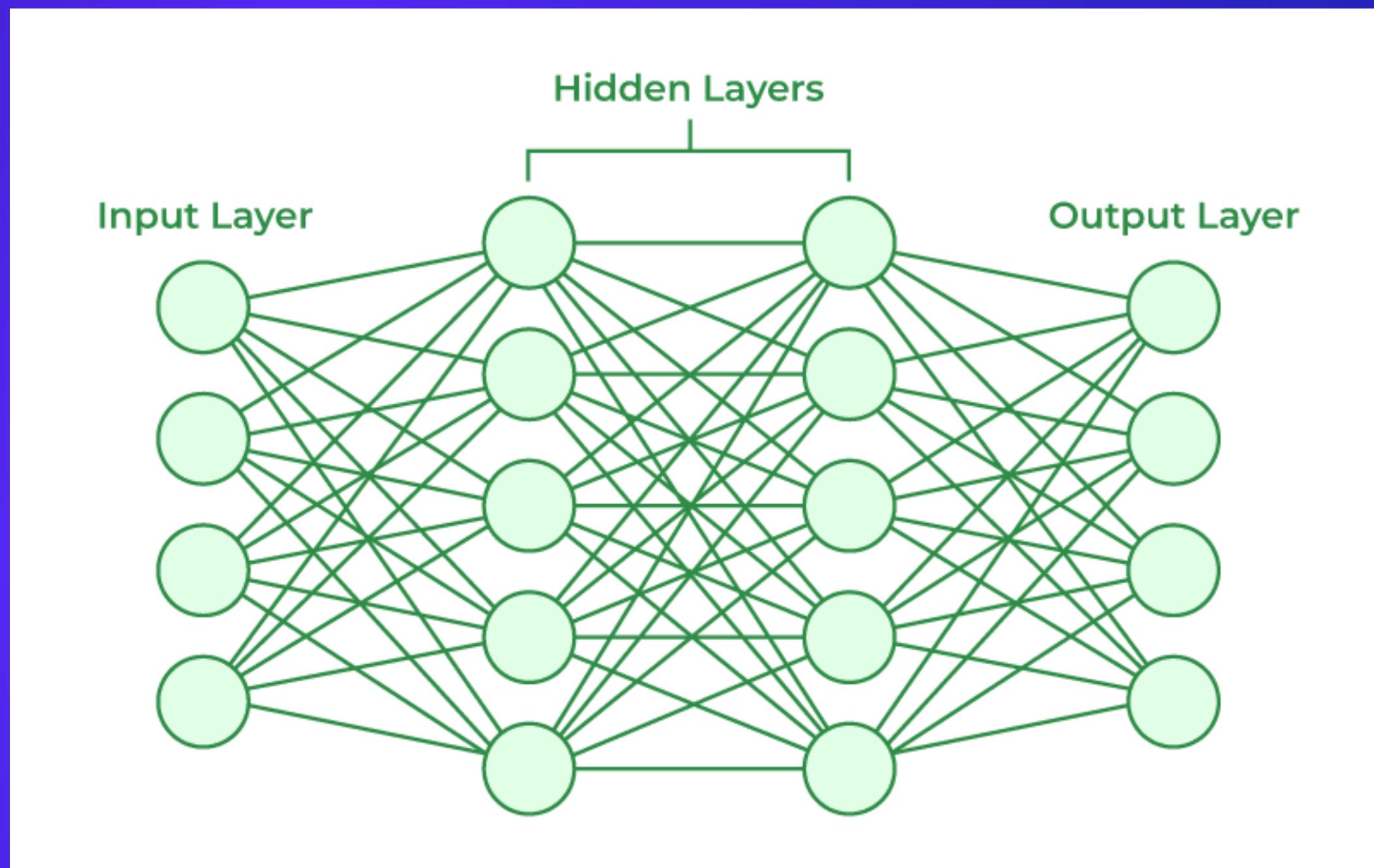


Question: can we apply linear activation on XOR logic?



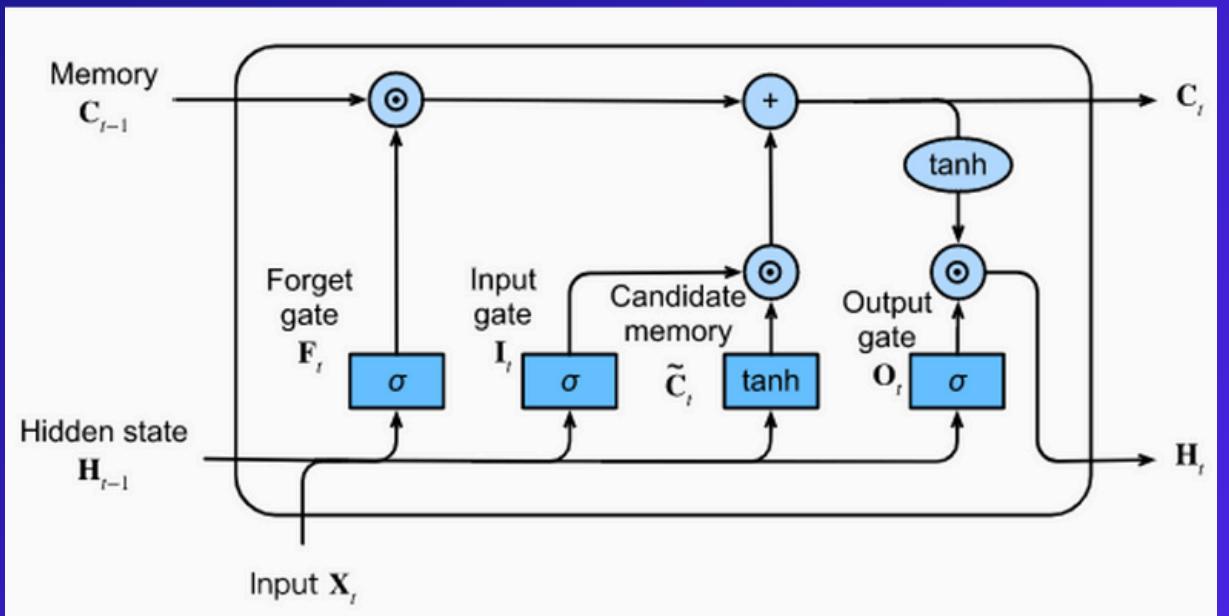
Overview of Neural Network

0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
2	2	2	2	2	2	2	2	2	2	2	2	2	2	2	2	2	2	2	2
3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3	3
4	4	4	4	4	4	4	4	4	4	4	4	4	4	4	4	4	4	4	4
5	5	5	5	5	5	5	5	5	5	5	5	5	5	5	5	5	5	5	5
6	6	6	6	6	6	6	6	6	6	6	6	6	6	6	6	6	6	6	6
7	7	7	7	7	7	7	7	7	7	7	7	7	7	7	7	7	7	7	7
8	8	8	8	8	8	8	8	8	8	8	8	8	8	8	8	8	8	8	8
9	9	9	9	9	9	9	9	9	9	9	9	9	9	9	9	9	9	9	9

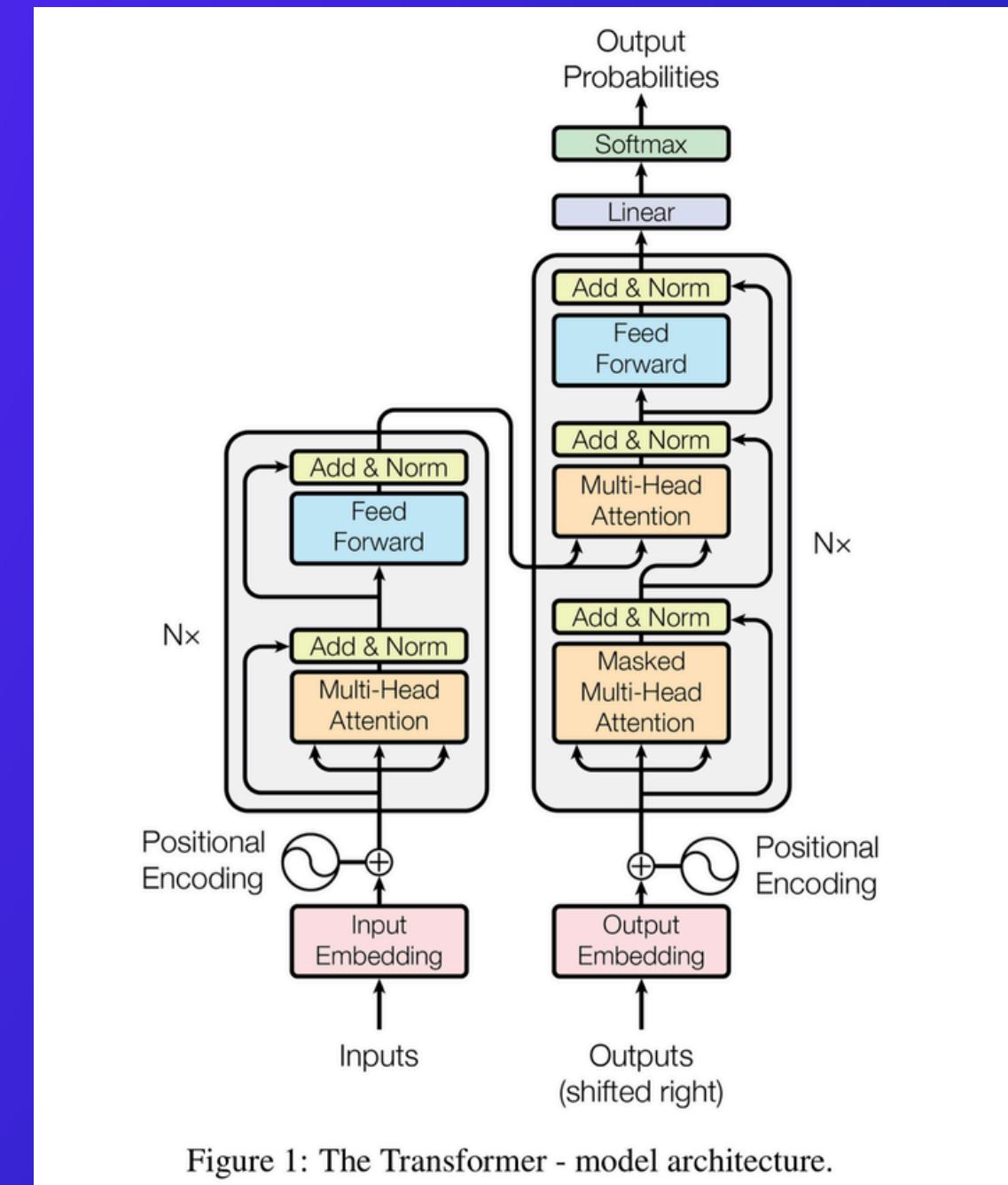


Different types of Neural Network

LSTM - Long Short Term Memory



Transformer Neural Network



CNN - Convolutional Neural Network

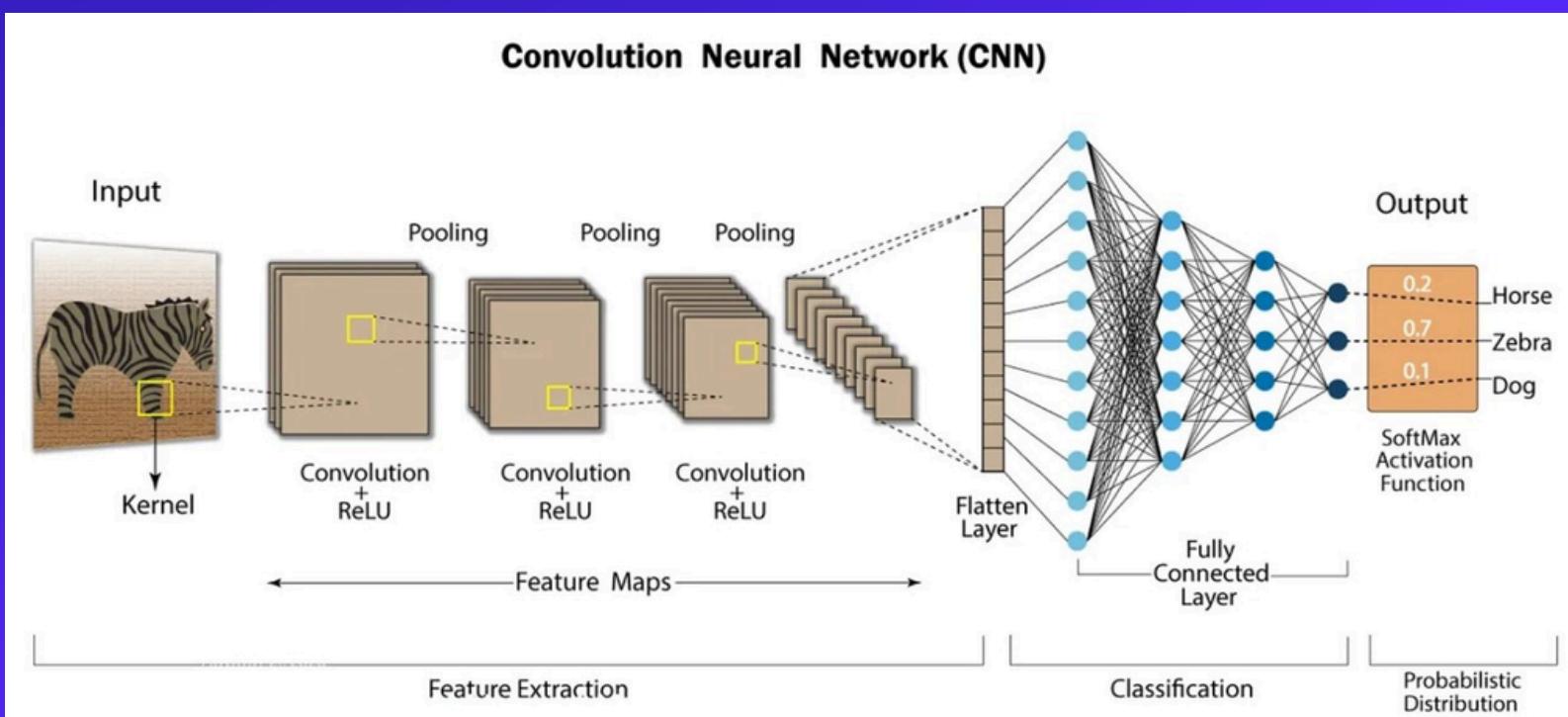
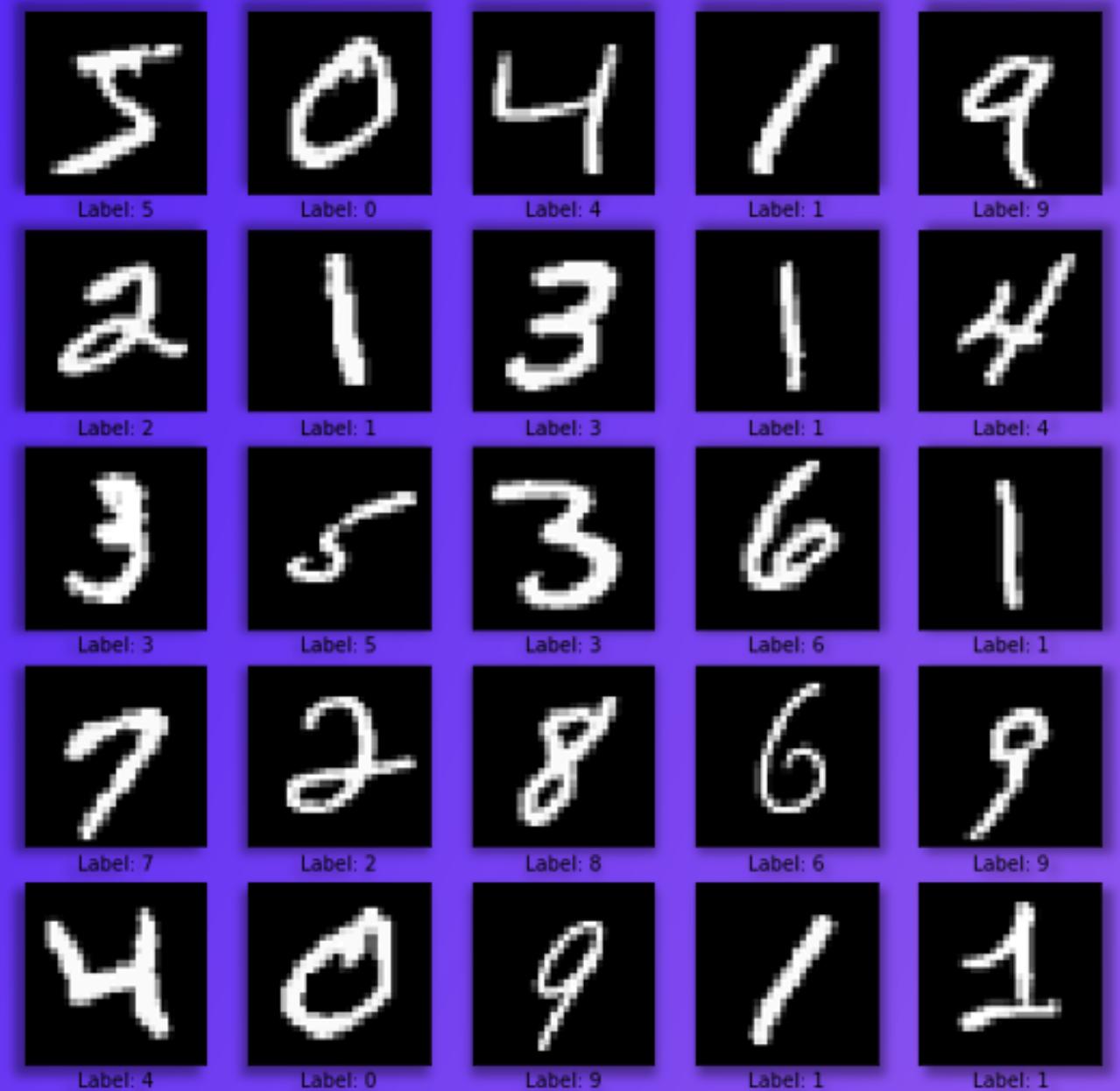
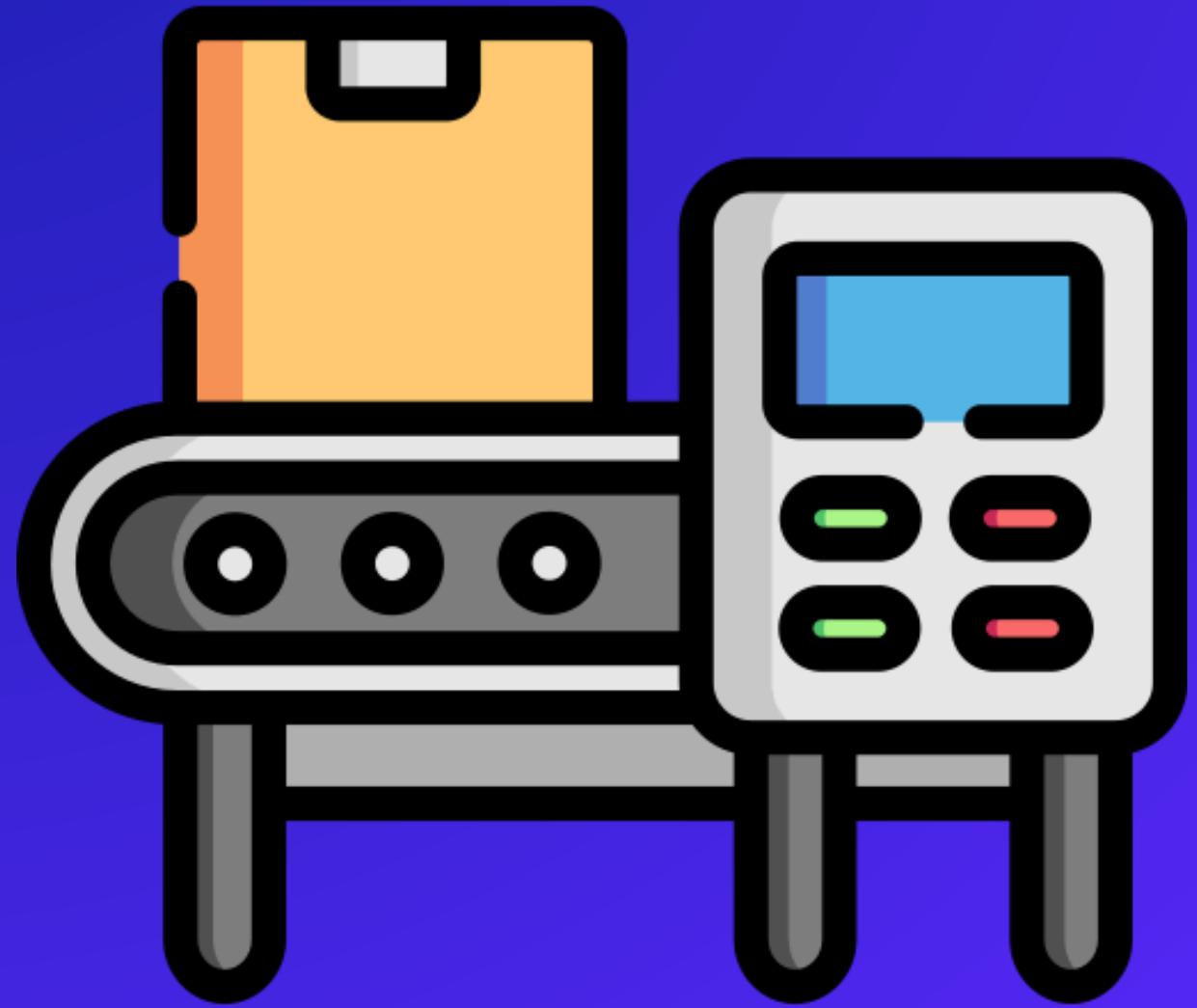
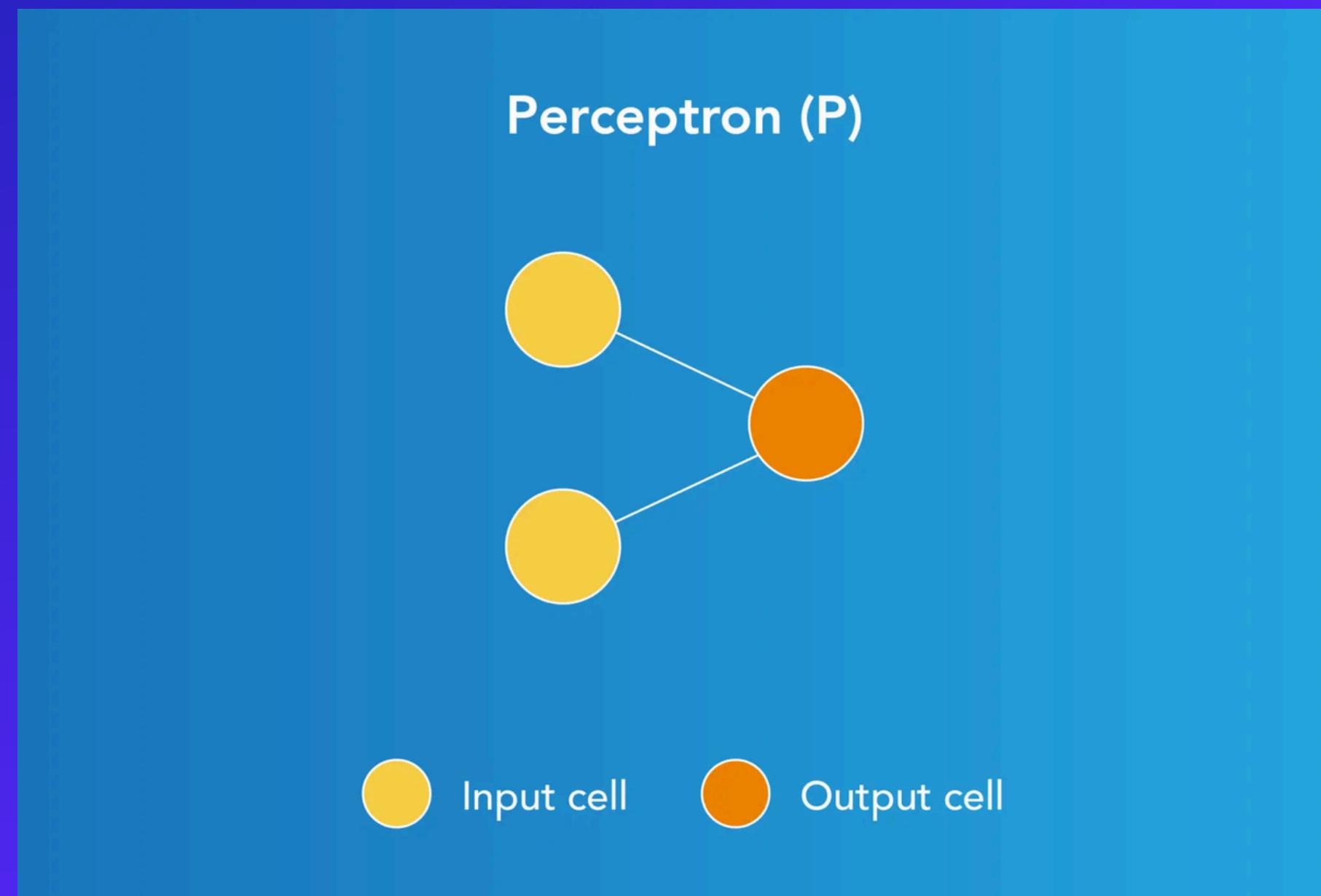


Figure 1: The Transformer - model architecture.

How does a machine learns these digit?



PERCEPTRON - THE BEGINNING OF NEURAL NETWORK



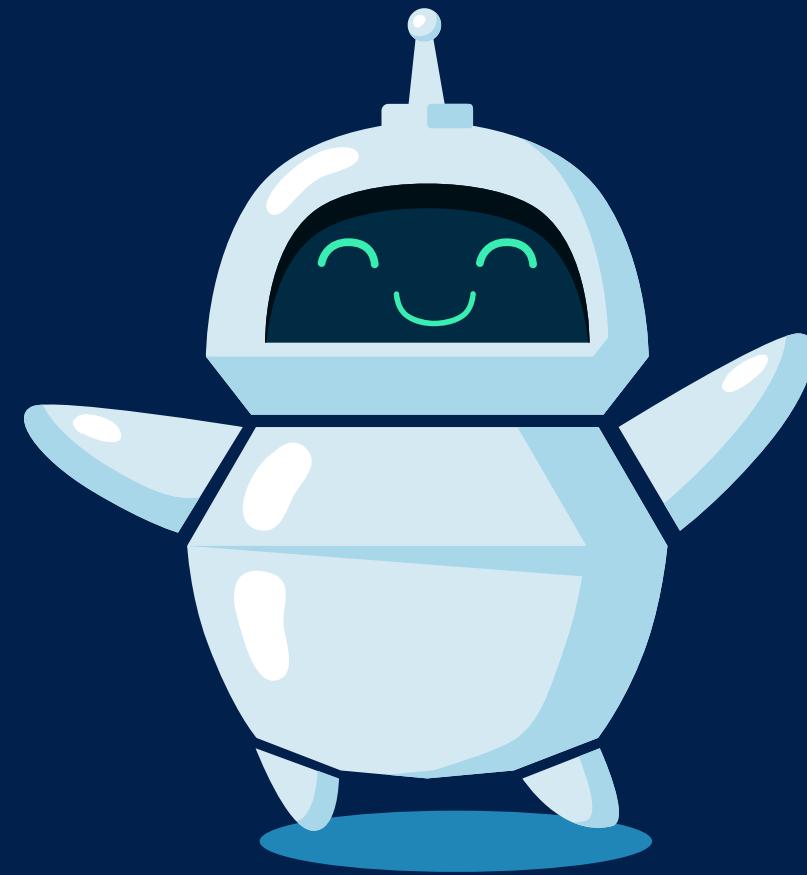
Can only solve **linear separable** problem

Ex: AND Logic

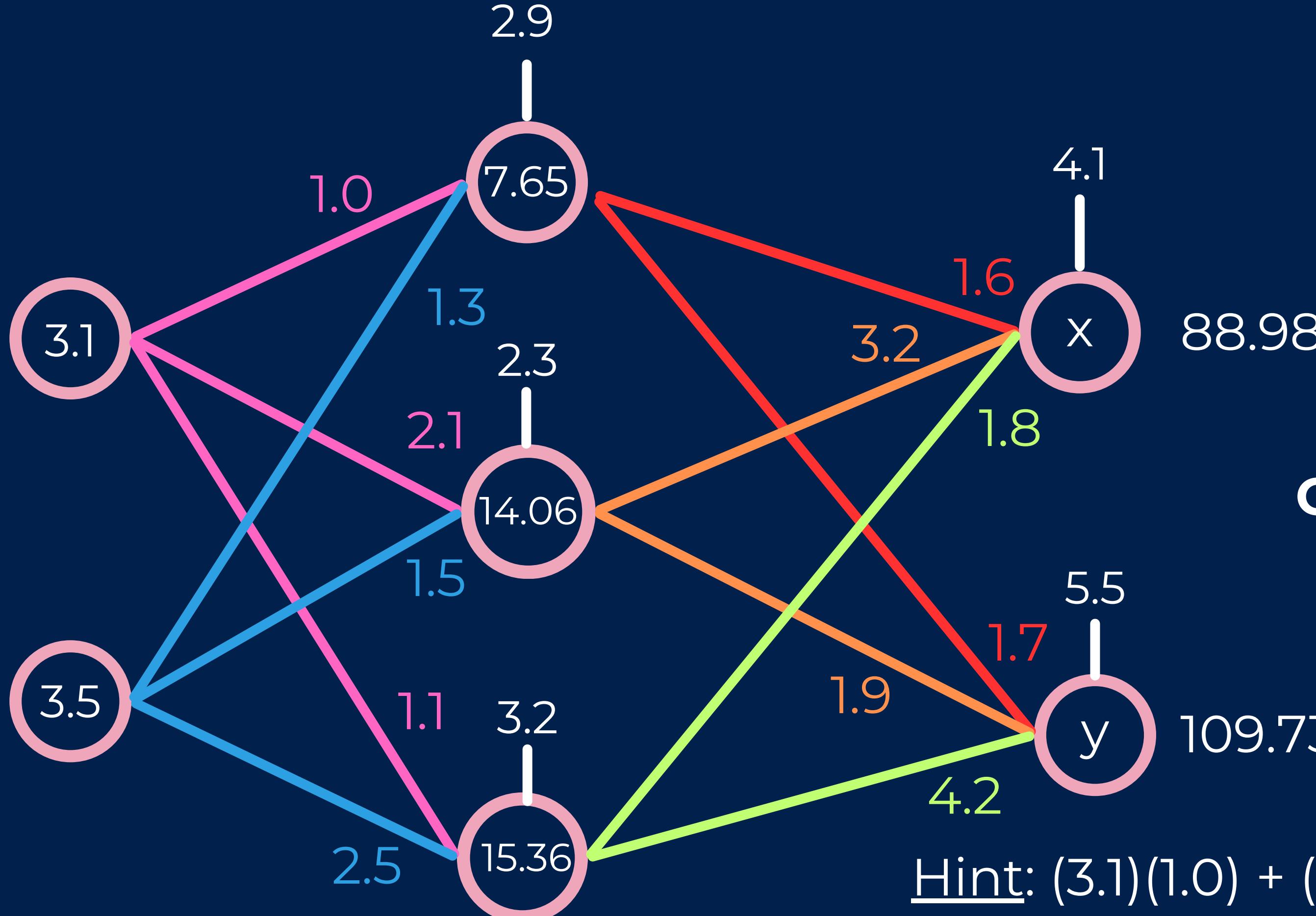
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Session 5

How Neural Networks Learn



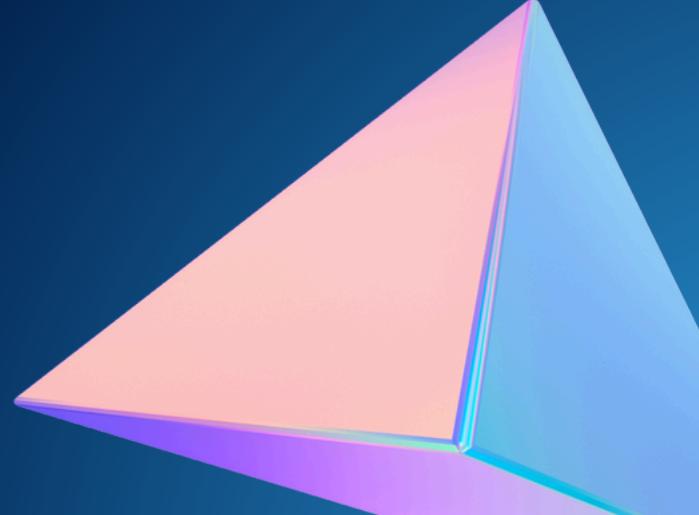
Recap



The Cost Function

A way for a machine learning algorithm to know how “wrong” it is. Below is a simplified version of a common one used in ML.

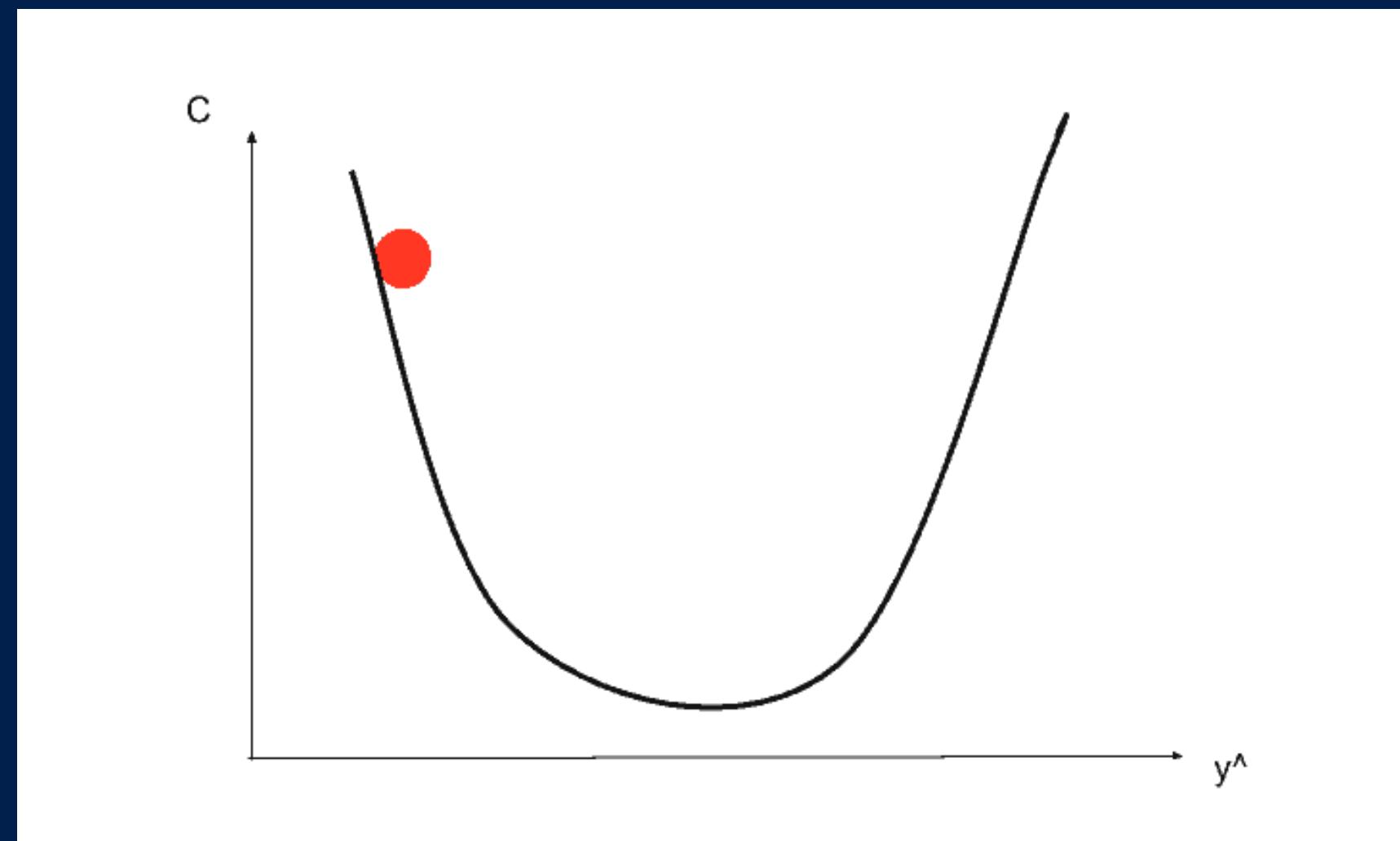
$$J(\dots) = \sum (predicted - actual)^2$$



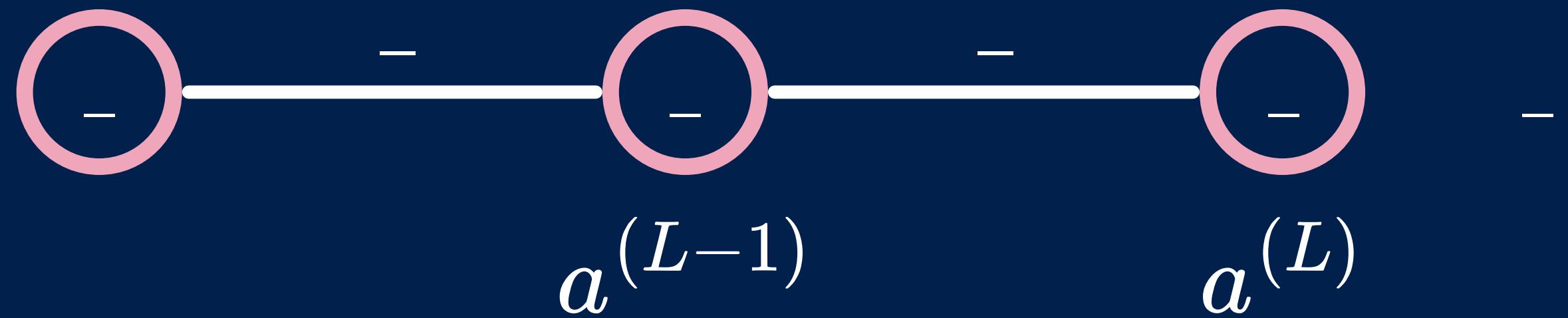
Gradient Descent

Since a high output of cost is not wanted, gradient descent is an algorithm used to **minimize** the cost function.

The lowest error we can get means that we get the weights and biases we want.

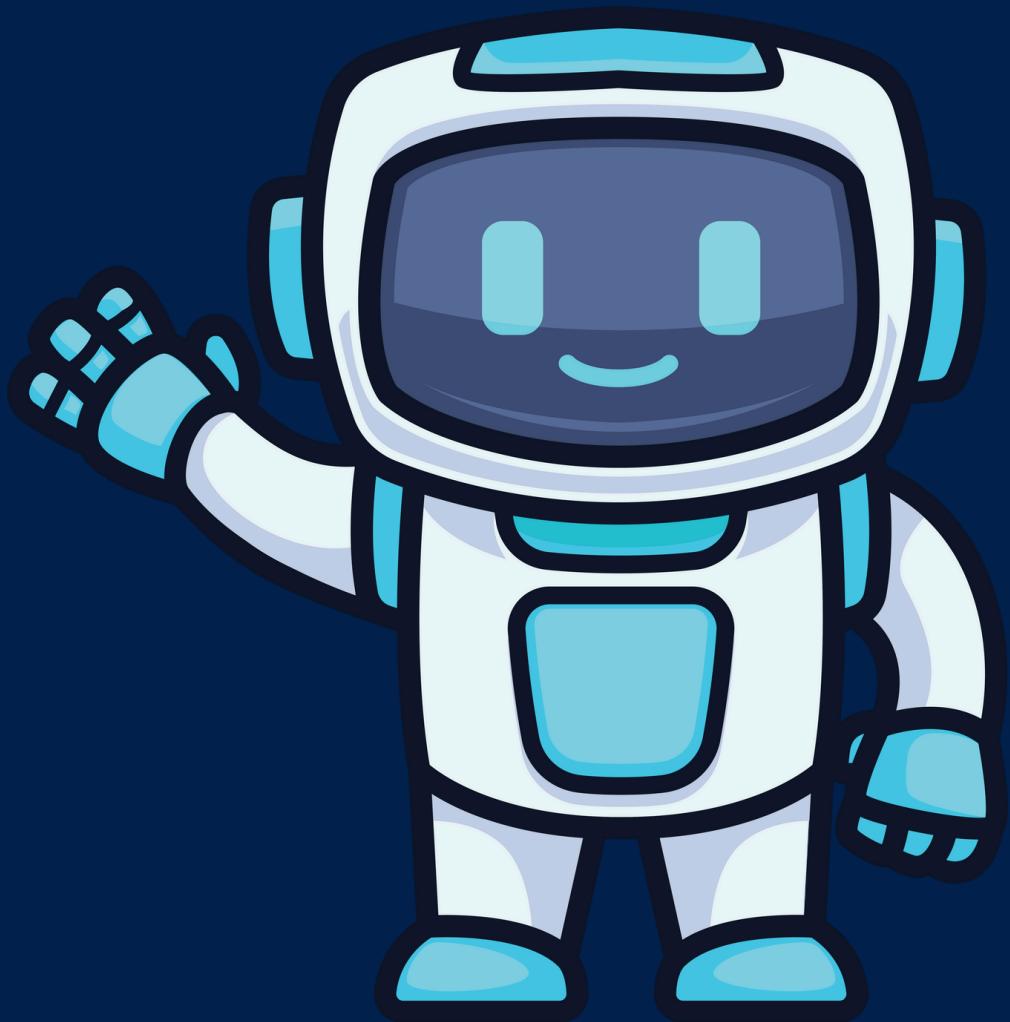


But how do we update?



Let's say our predicted value here is:, but we want a target value of. How do we update the weights and biases?

Thank You!

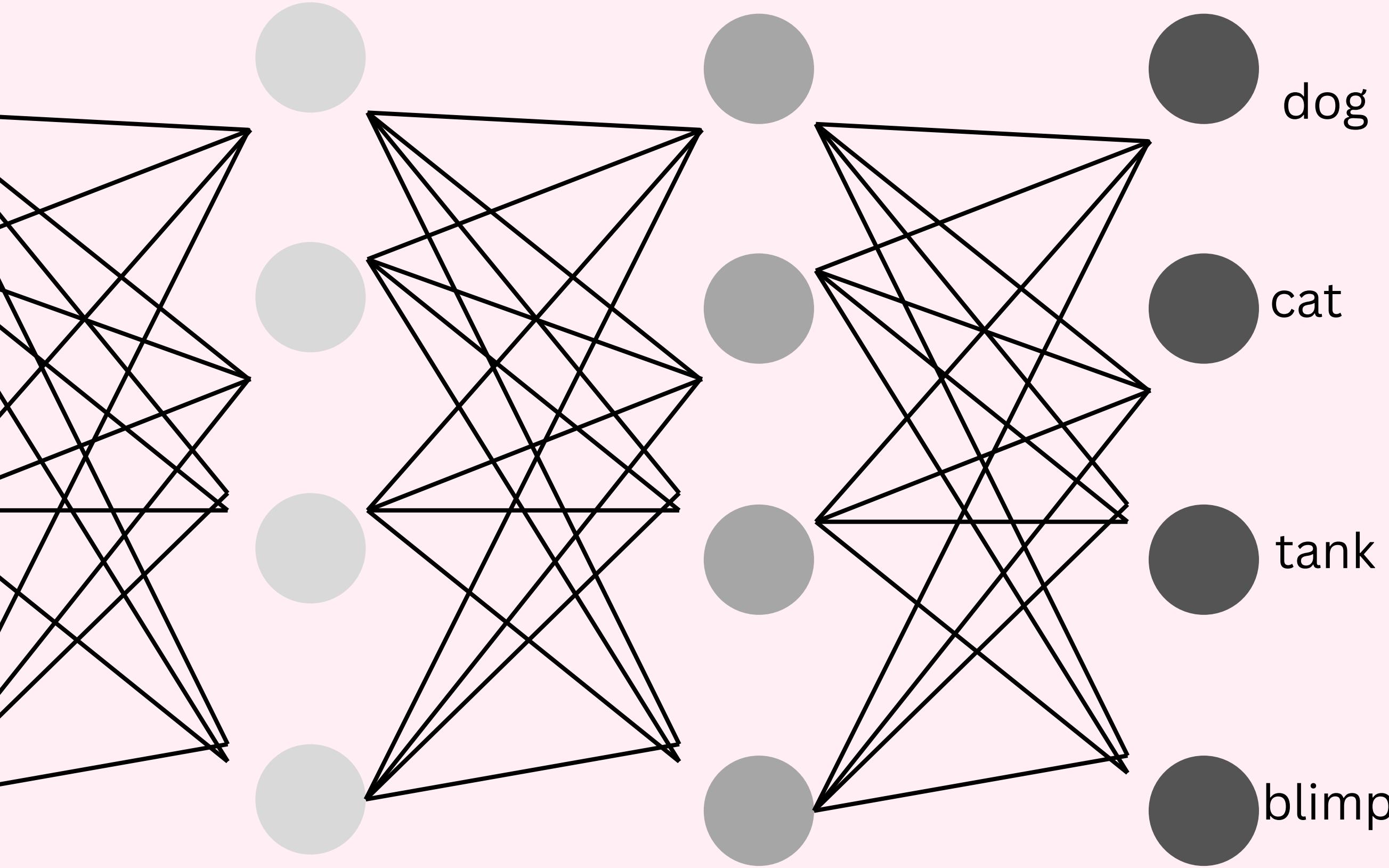


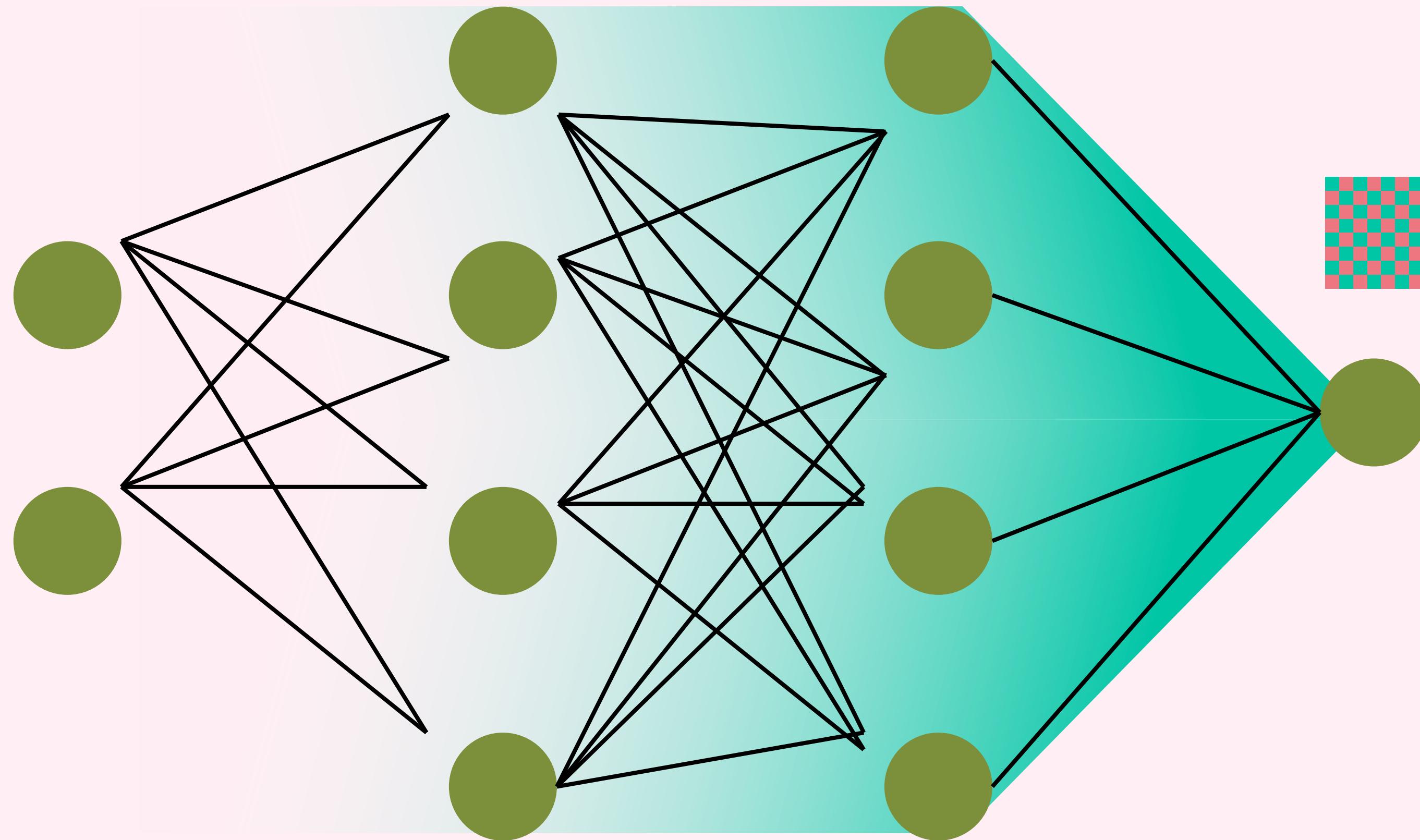
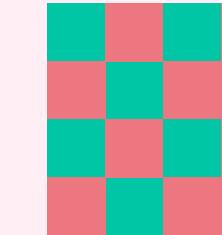
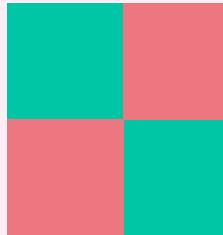
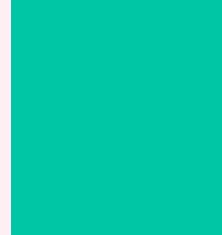


Fine-tuning

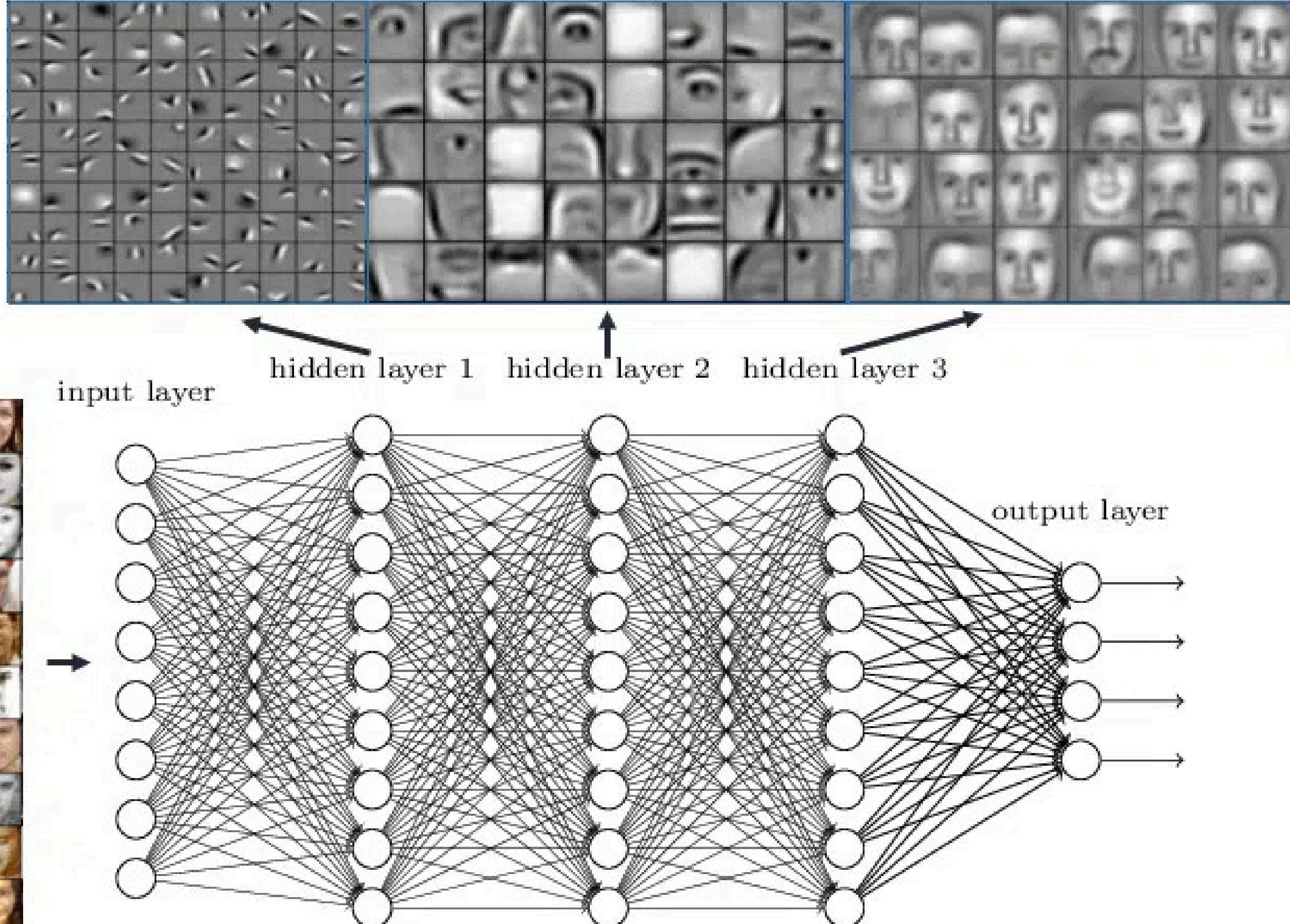


What is it?



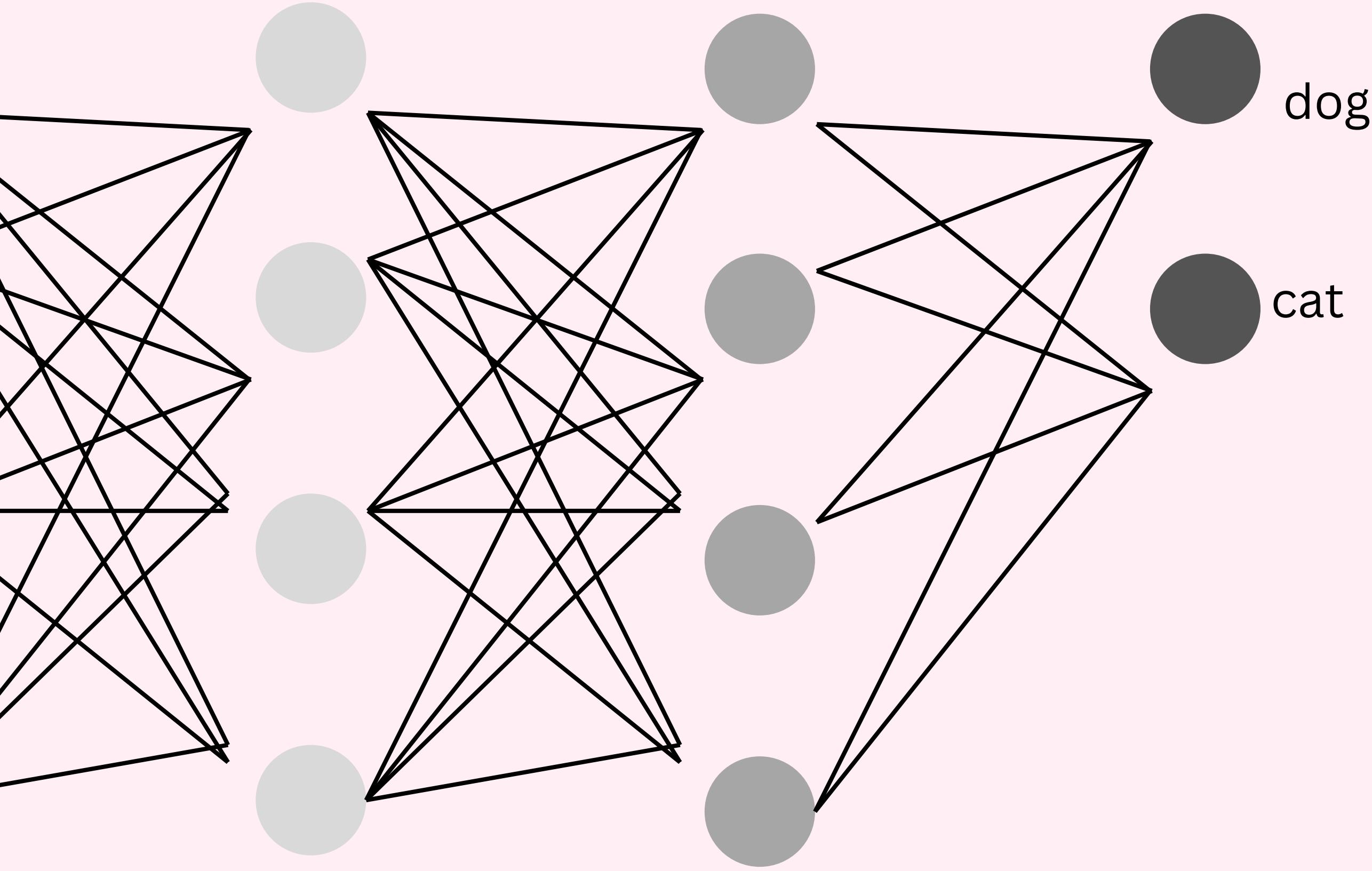


Deep neural
networks learn
hierarchical feature
representations





Top Layer
Fine-Tuning



asparagus

vent

blanket

dog tank

dog

blimp-tank

cat

tank

blimp

Dataloader

Speed

Ease

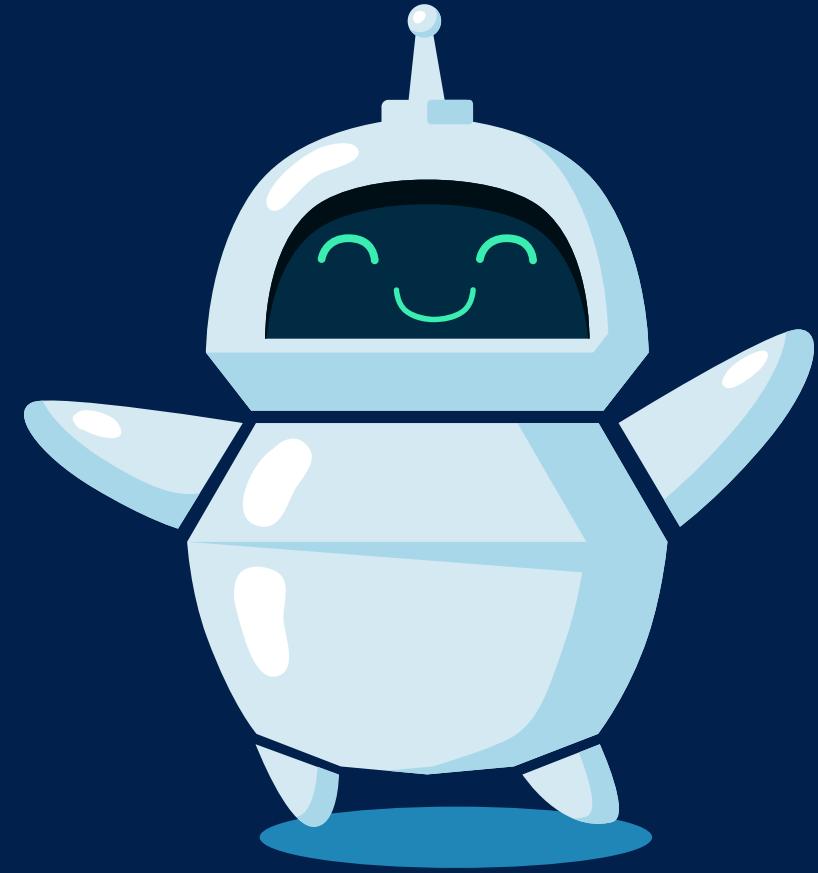
Pros
/
Cons

IP
Dependent on existing
representations

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Session 7

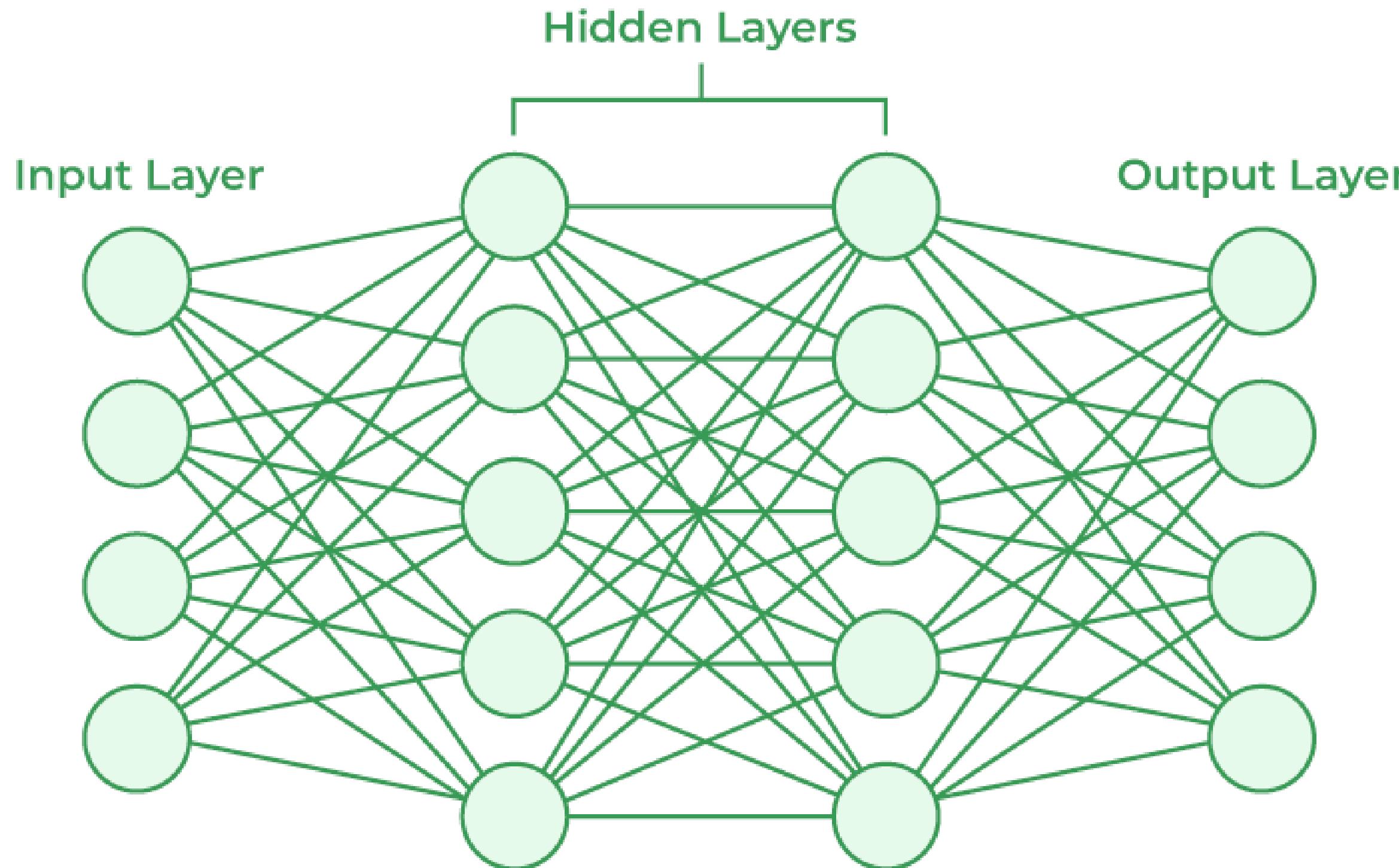
Fine Tuning an LLM



Quick Announcements

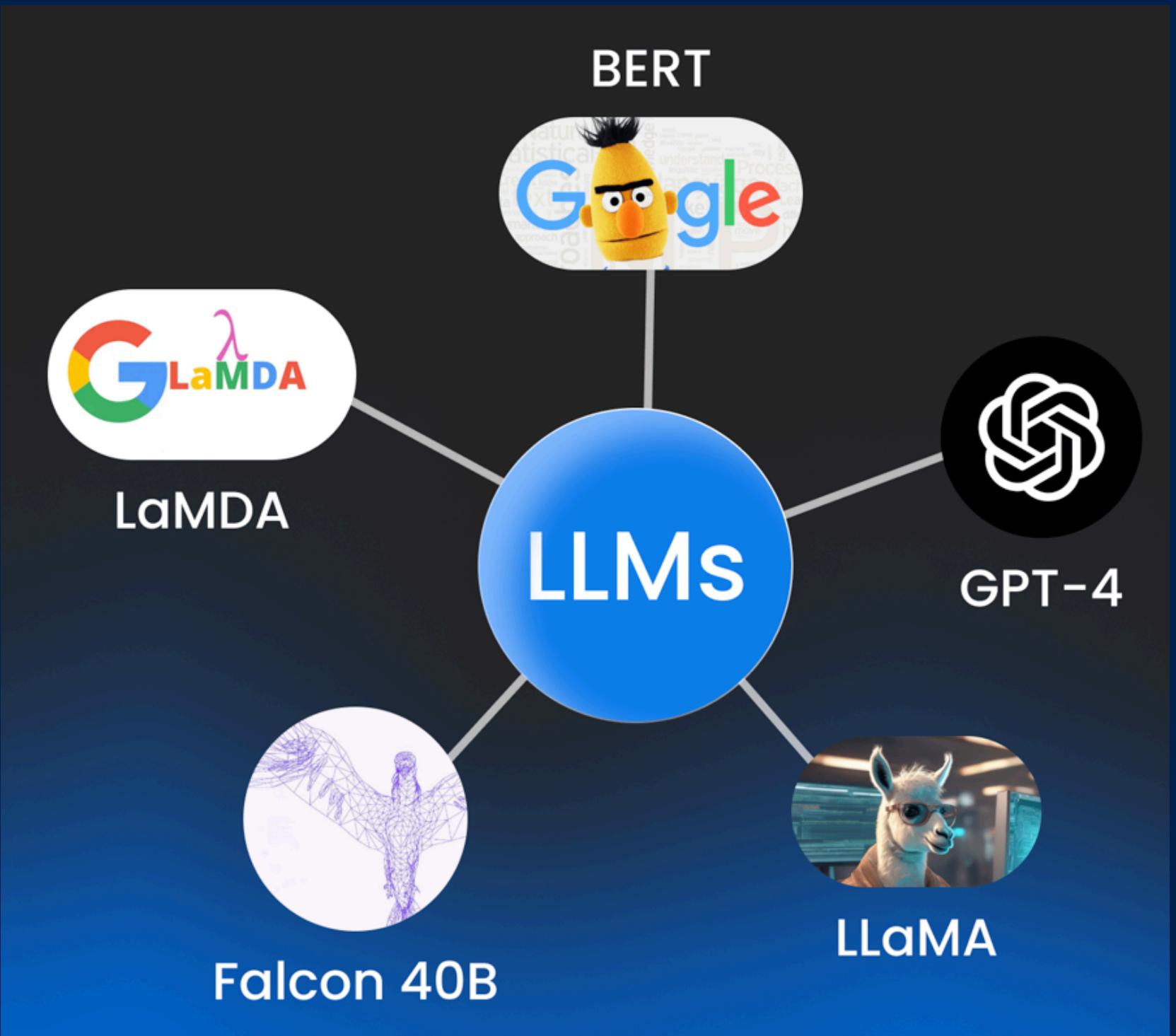
- New form for fine tuning project in discord, old one is fine to submit
- NN projects will be finished evaluated by late this week and early next week

Fine Tuning Recap



What is an LLM

Simply put, an LLMs are built on a specialized type of Neural Network architecture called a Transformer, used mainly to work with language.



More about BERT

BERT is a LLM
developed by Google
with a focus on
language
understanding rather
than text generation.



Transformers

1. Positional Encoding

a. "I love my dog"

2. Attention

a. "The agreement on the European Economic Area was signed in August 1992."

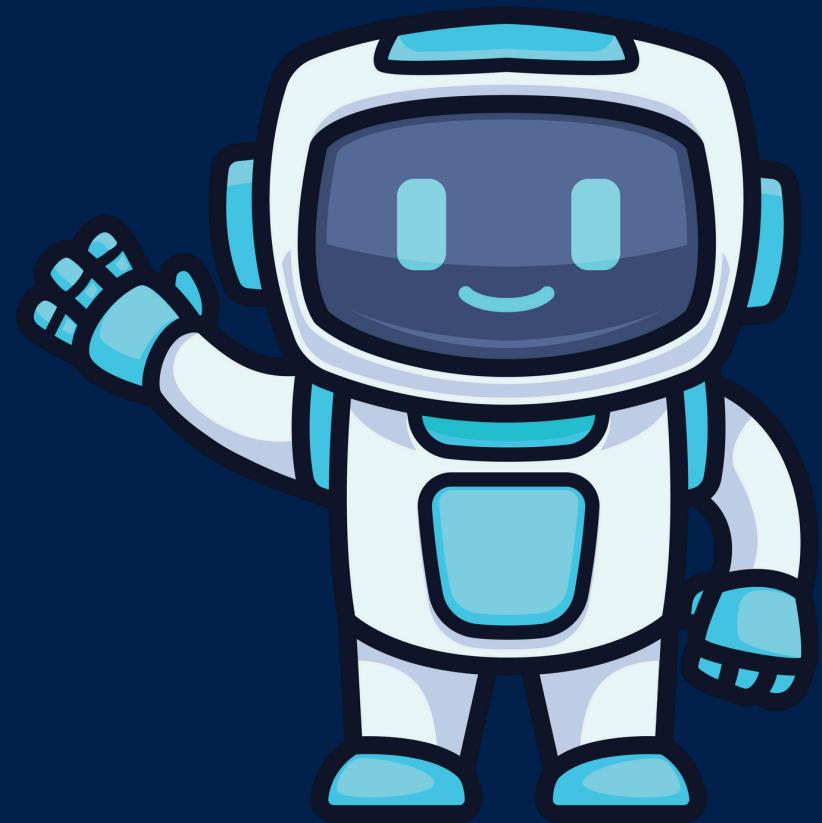
3. Self Attention (The key)

a. "Server, can I have the check?"

b. "Looks like I just crashed the server"

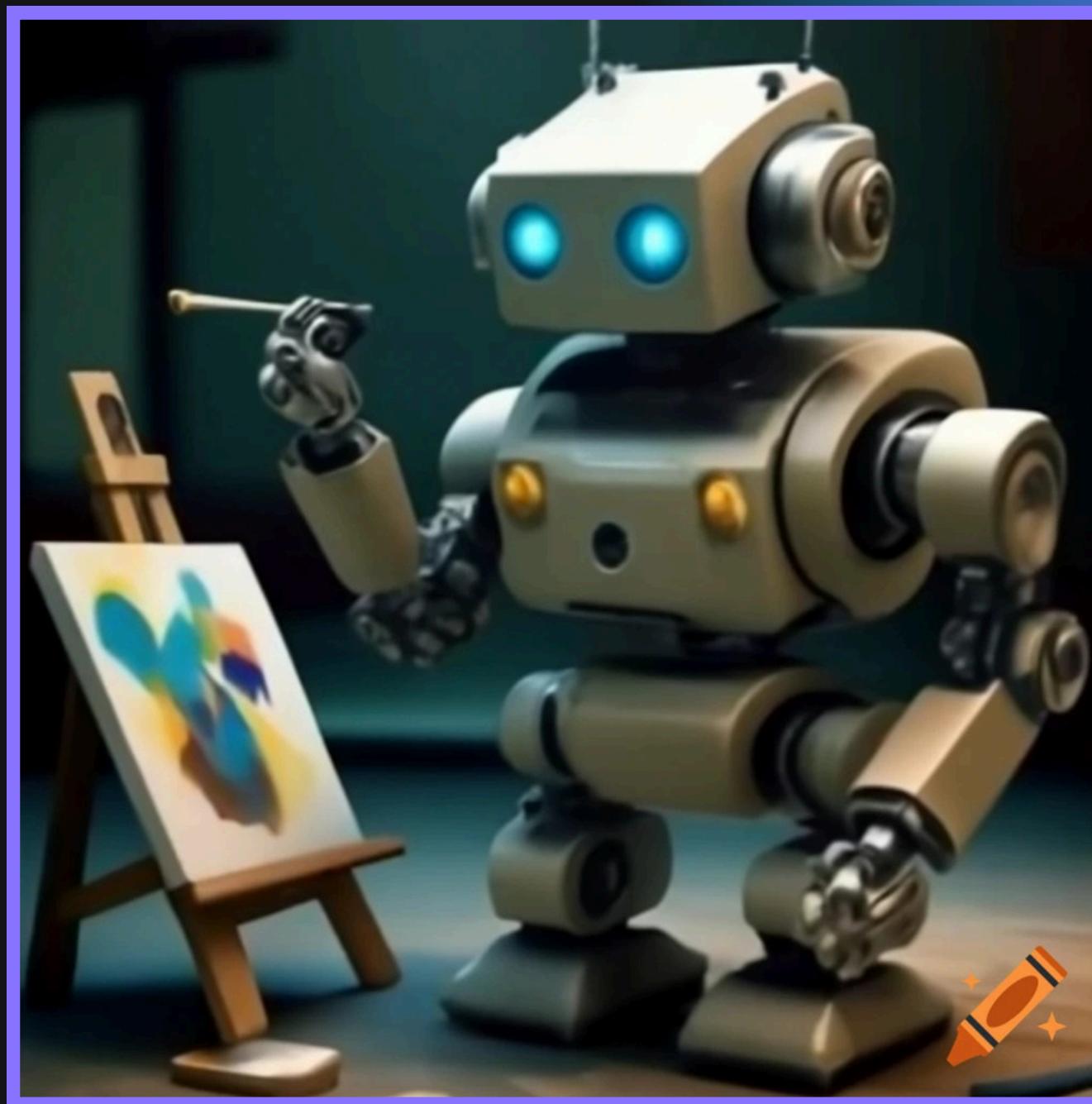


Thank You!



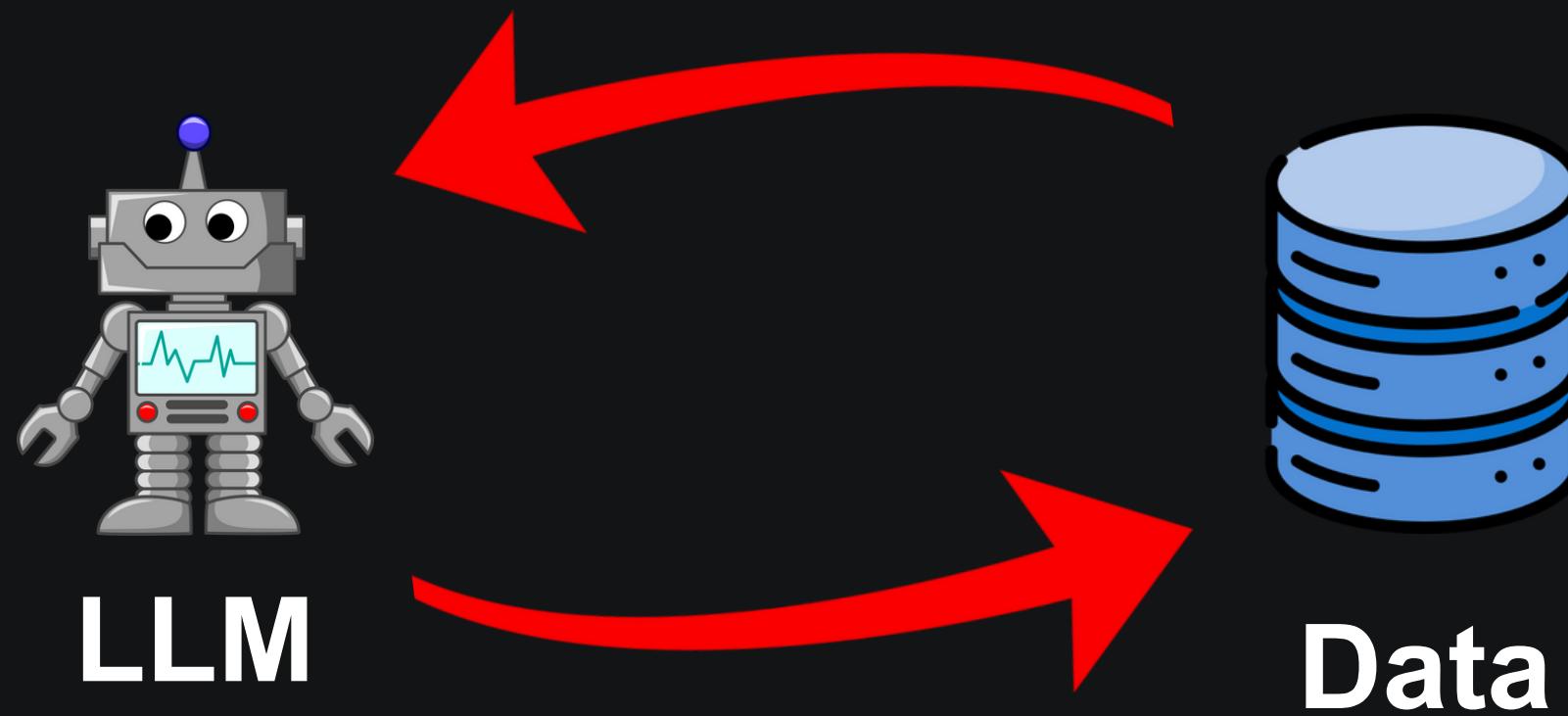
INCREASING LLM PERFORMANCE WITH

RAG



Retrieval Augmented Generation

- Use reference material to inform LLM responses
- Adaptable to growing/changing data
- Don't increase generation time by too much



Why RAG?

- **Specialized Knowledge**
- **Expert on your specific data**
- **Cite sources**

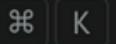




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What is RAG in machine learning?

What is RAG in machine learning?

❖ Sources

What is RAG? - Retrieval-Augmented Generation AI Explained - AWS

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What is retrieval-augmented generation (RAG)? - IBM Research

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✳️ Perplexity

Retrieval-Augmented Generation (RAG) is an innovative approach in machine learning that enhances the capabilities of large language models (LLMs) by incorporating external knowledge sources. Here's a comprehensive overview of RAG:

Definition and Purpose

RAG is a framework that optimizes the output of LLMs by referencing authoritative knowledge bases outside of their original training data [①](#). It aims to improve the accuracy, relevance, and timeliness of AI-generated responses without the need to retrain the entire model [①](#) [②](#).

How RAG Works

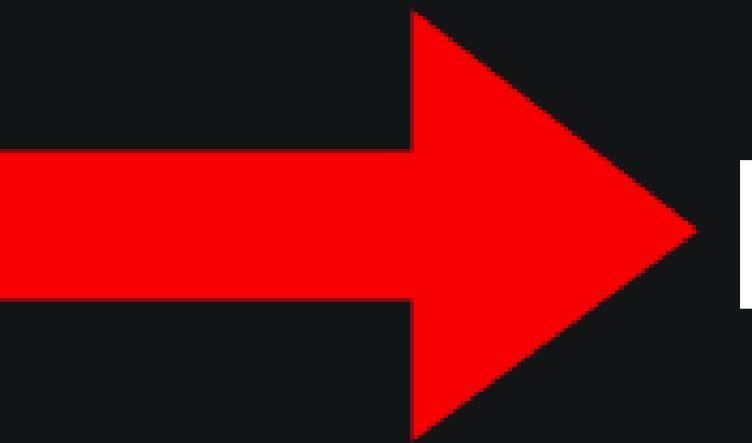
The RAG process involves two main phases:

[1](#) Retrieval Phase:

High view of how it works

High view of how it works

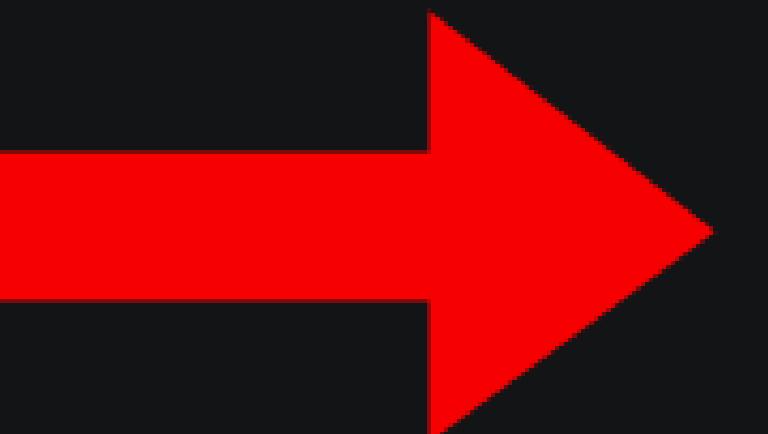
“Who is the greatest basketball player of all time?”



[51, 25.2, 32.5, 76.6]

High view of how it works

“Who is the greatest basketball player of all time?”



[51, 25.2, 32.5, 76.6]

“Jordan is an alright player.”



[-21, 14.4, -31, 9.3, 1.2]

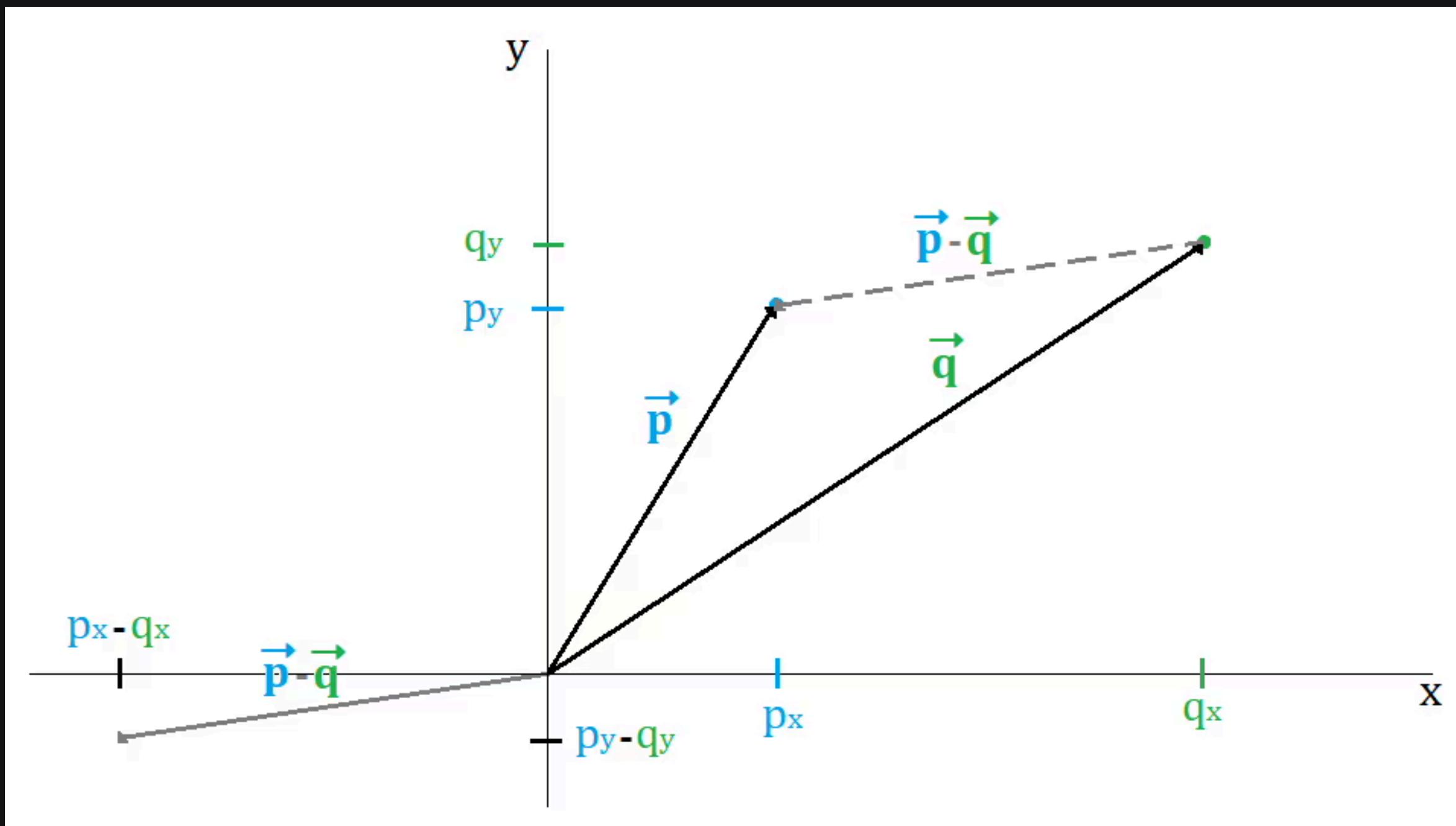
“Lebron is the great player of all time.”



[9.4, 10, 23, 1.4, 8.2]

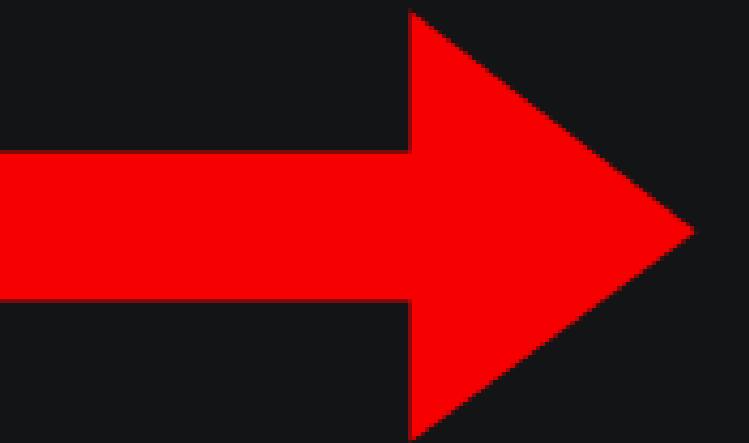
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High view of how it works



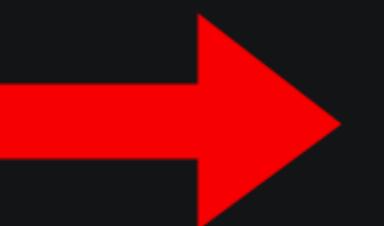
High view of how it works

“Who is the greatest basketball player of all time?”



[51, 25.2, 32.5, 76.6]

“Lebron is the great player of all time.”



[9.4, 10, 23, 1.4, 8.2]

High view of how it works

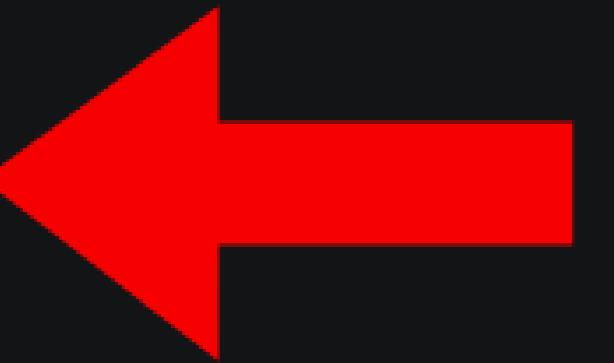
“Who is the greatest basketball player of all time?”



“Lebron is the great player of all time.”

High view of how it works

“Lebron is the greatest basketball player of all time, of course.”



The difference between fine tuning an LLM and RAG

RAG

- Extremely adaptable
- Used when you need more accurate information from LLM

Fine tuning

- Not adaptable + expensive
- Used when you want the LLM to “act” in a specific manner

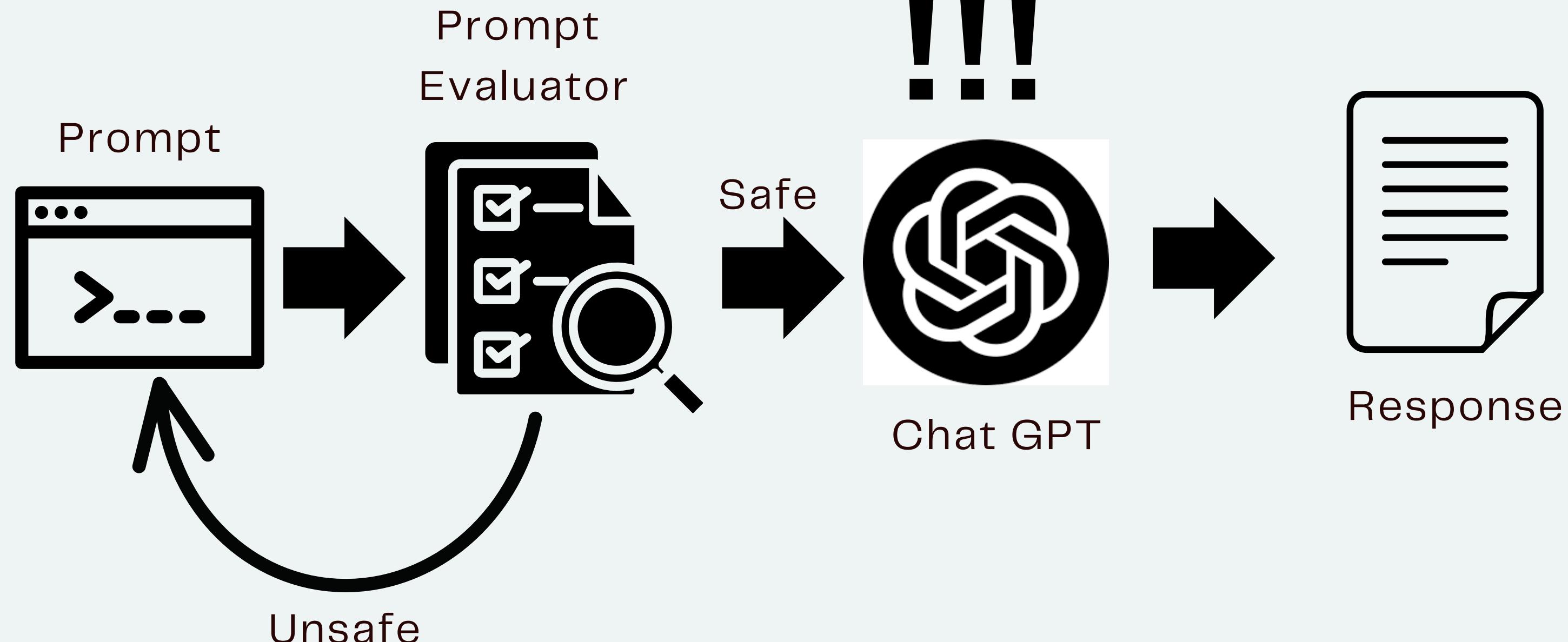
RAG Demo



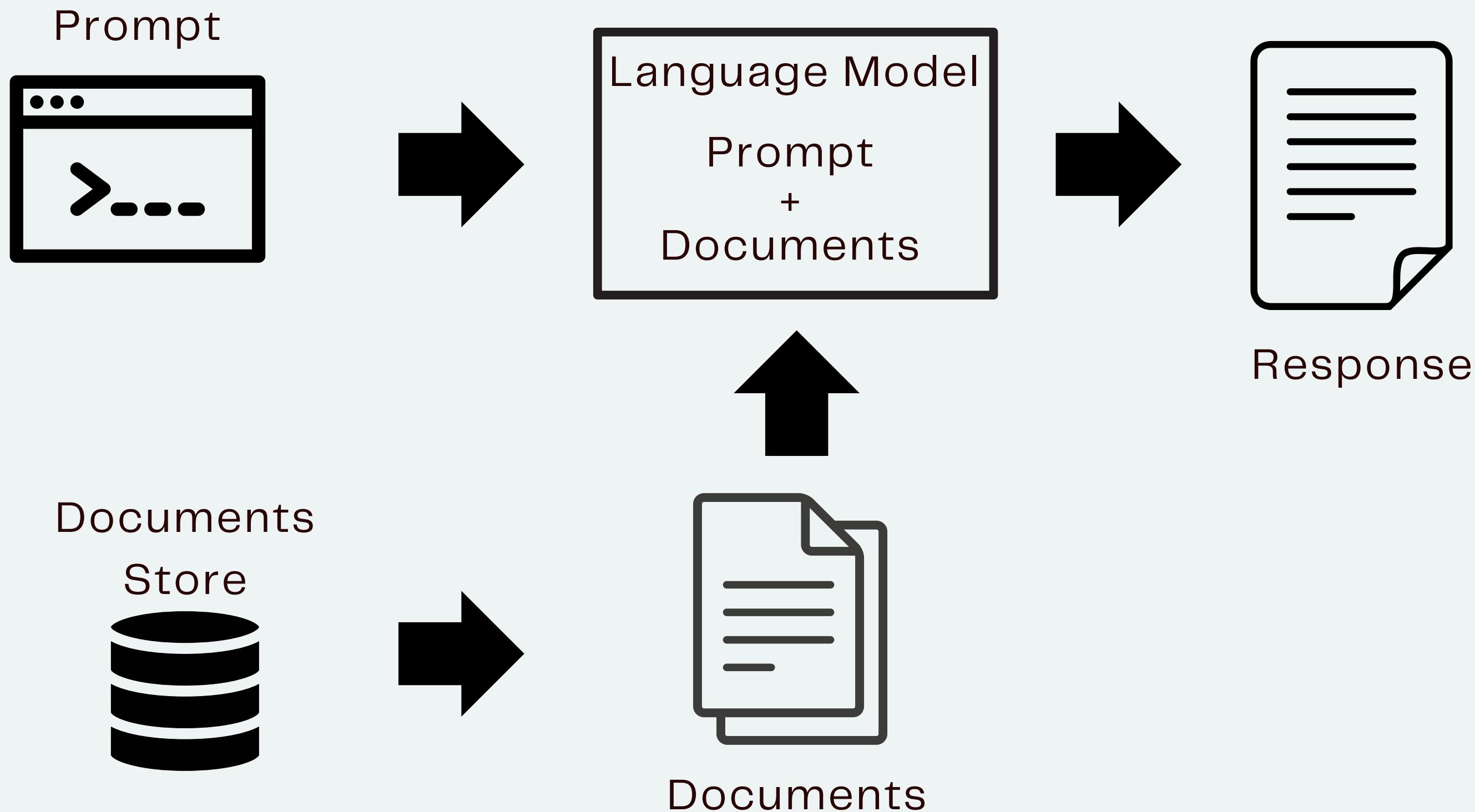
Attendance

**RETRIVAL
AUGMENTED
GENERATION &
RAPID DEVELOPMENT**

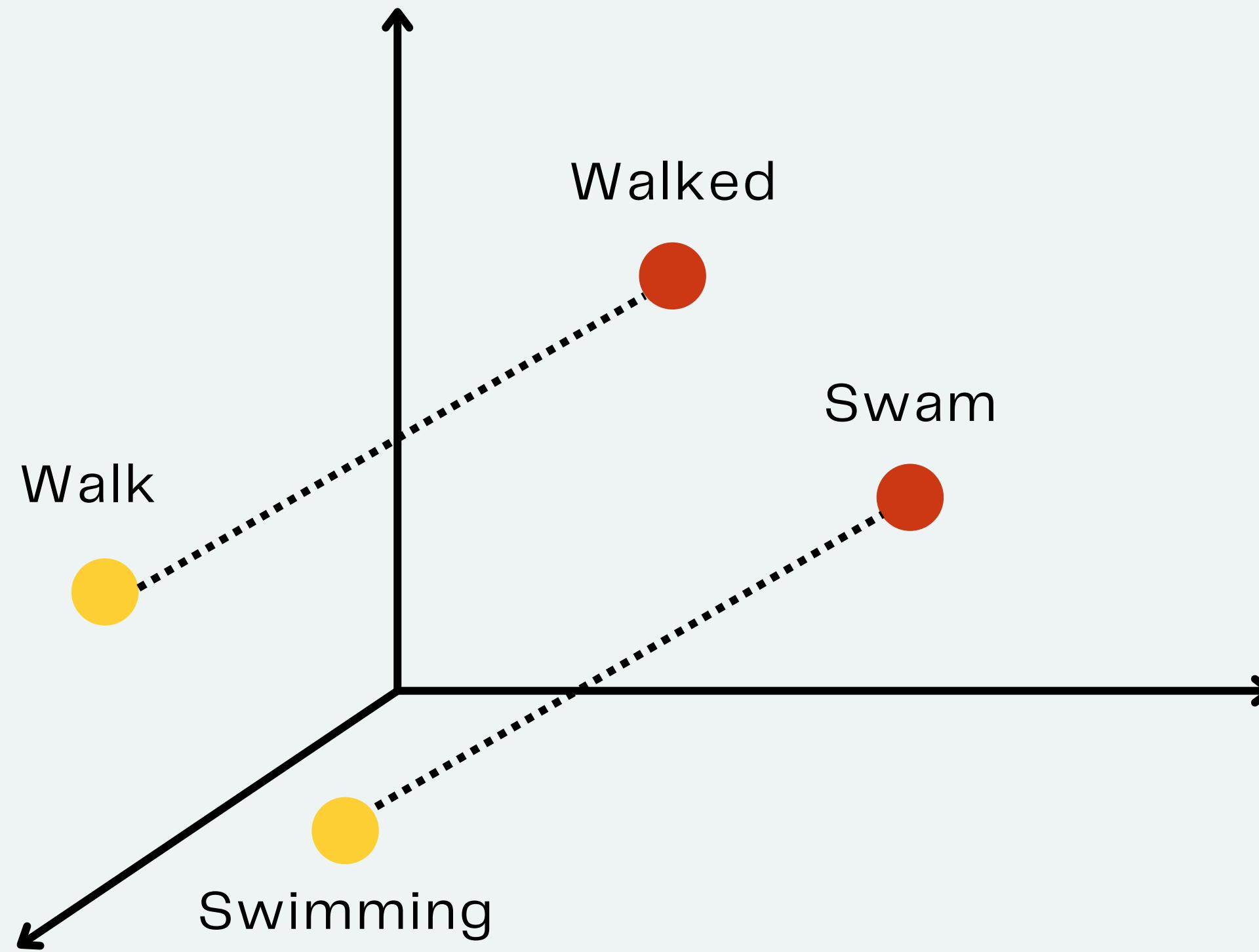
REGULAR CHAT GPT WORKFLOW



WHAT IS R.A.G.?



WORD TO VECTOR



WORD TO VECTOR

	Living	Being	Feline	Human	Gender	Royalty	Verb	Plural
Cat	0.6	0.9	0.1	0.4	-0.7	-0.3	-0.2	
Kitten	0.5	0.8	-0.1	0.2	-0.6	-0.5	-0.1	
Dog	0.7	-0.1	0.4	0.3	-0.4	-0.1	-0.3	
Houses	-0.8	-0.4	-0.5	0.1	-0.9	0.3	0.8	

