

# Welcome to Day 5!

Today: AI Classification, Project time, Final Presentations,



Advanced Search  
Language Tools

i feel like a	
i feel like a woman lyrics	708,000 results
i feel like a woman	38,100,000 results
i feel like a failure	27,600,000 results
i feel like a wog	37,400 results
i feel like a newborn	1,930,000 results
<b>i feel like a pig shit in my head</b>	<b>12,400 results</b>
i feel like a loser	4,610,000 results
i feel like a newborn lyrics	104,000 results
i feel like an aeroplane above the rain	36,300 results
i feel like a star	40,100,000 results

Advert... le.com close

# HOW DO THEY KNOW WHAT YOU WANT?



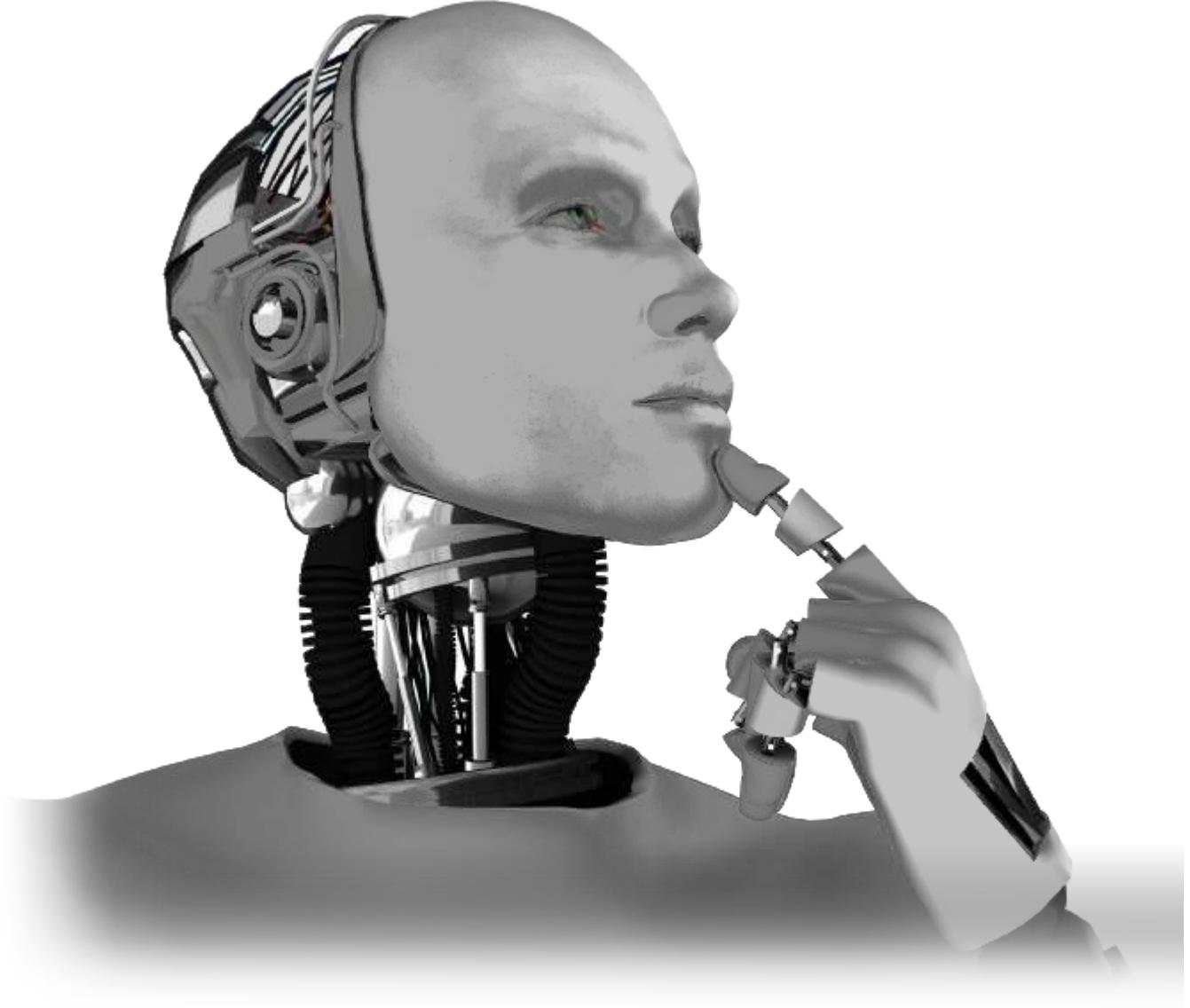


# **INTRO TO AI/ML**

## Classification

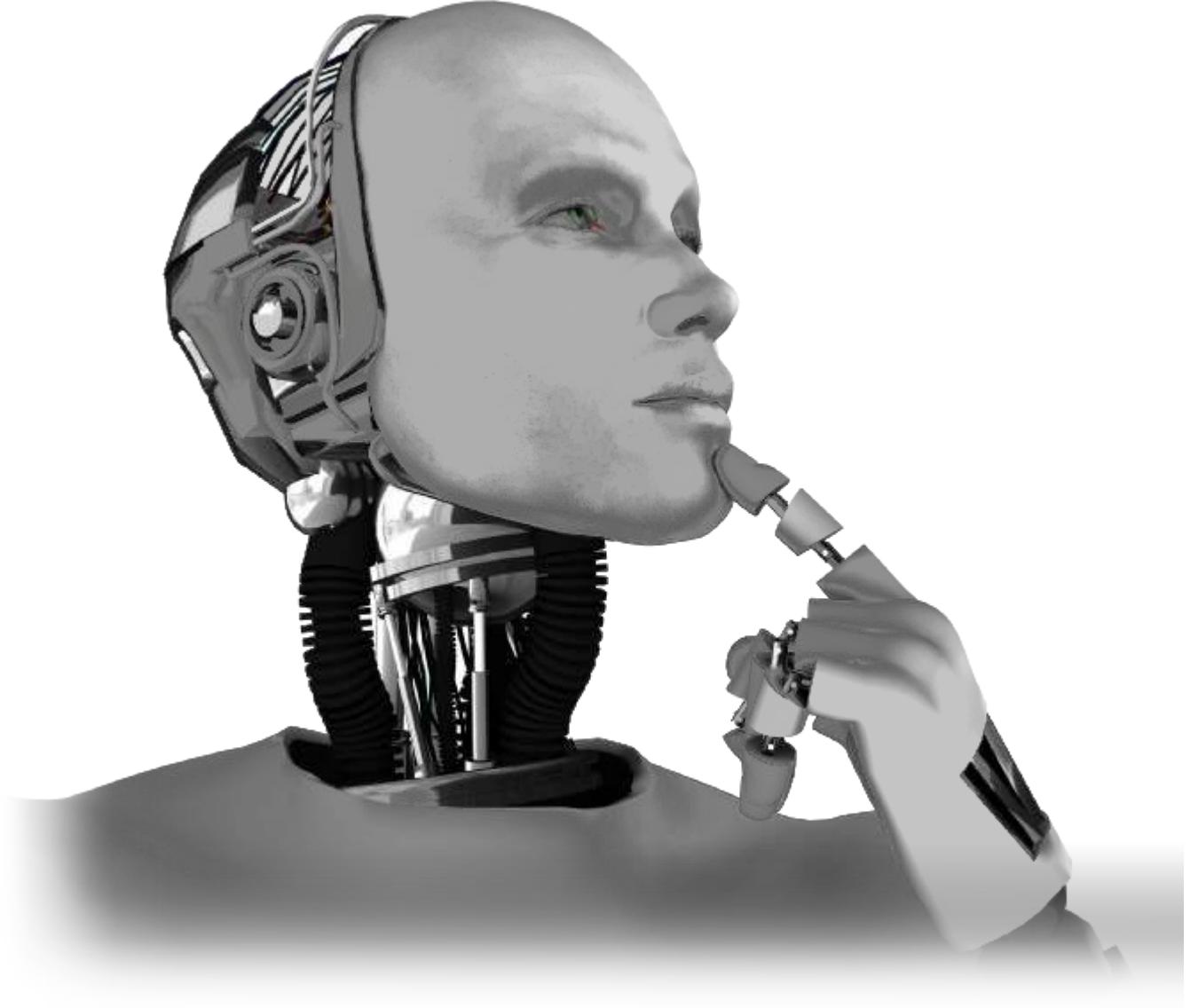
# Agenda

- **Definition**
- **Applications**
- **Classification**
  - problem**
- **Classification**
  - systems**
- **Conclusion**
- **Lets test ourselves!**



# Agenda

- **Definition**
- **Applications**
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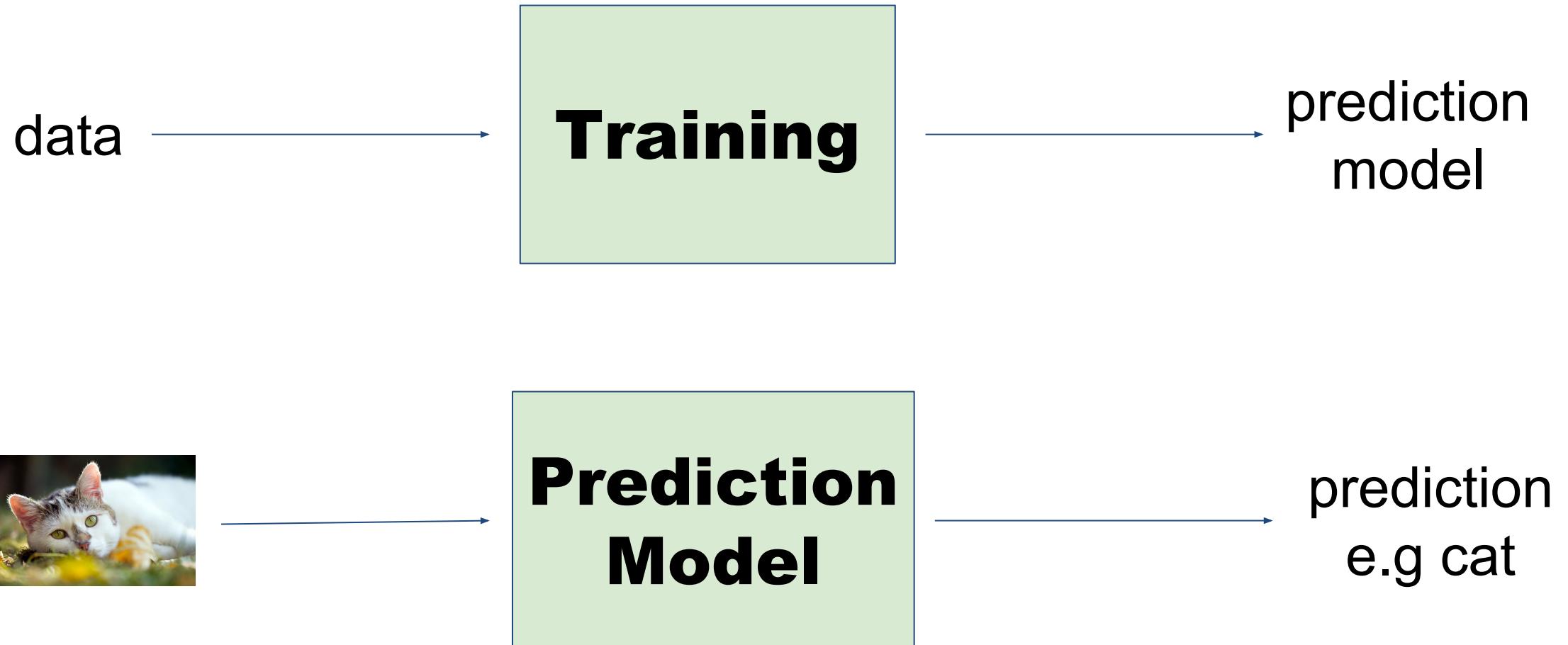
# WHAT IS A.I.?

A branch of computer science that tries to create systems that can model and imitate the intelligent behaviour of the human mind in computers.

**Human beings are the most intelligent creatures**



# AI enables recognition



# Applications

**Google Now**



**Siri**



**Cortana**



**Google Now, Siri**

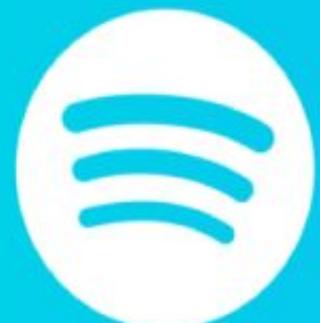
and **Cortana** are intelligent digital personal assistants on (iOS, Android, and Windows). They all help using **voice**.

We can use them to make calls, send messages, set reminders, take notes, find music, find restaurants, check our calendars, and more.

# facebook®



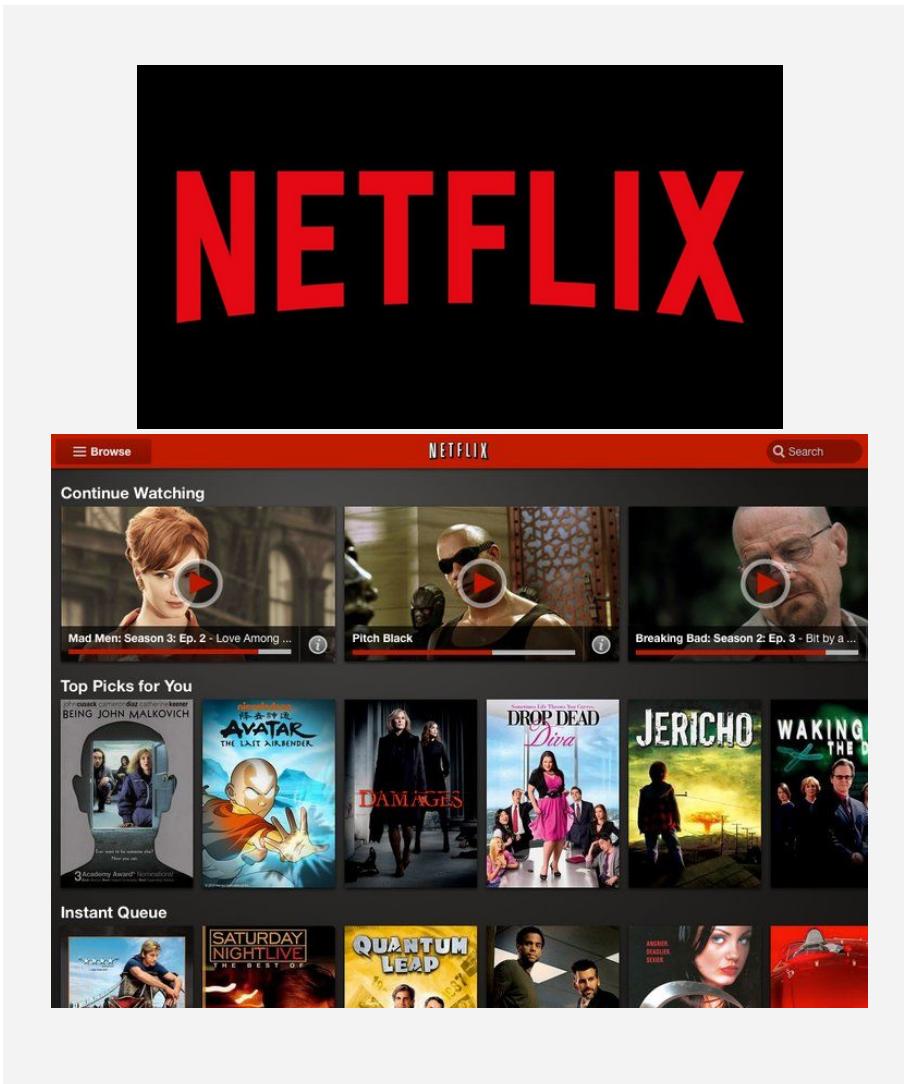
***Applications***



# Spotify®



# Applications



**Netflix** is an intelligent system that uses Machine Learning to predict & suggest movie preferences to users.

How is Netflix Intelligent?

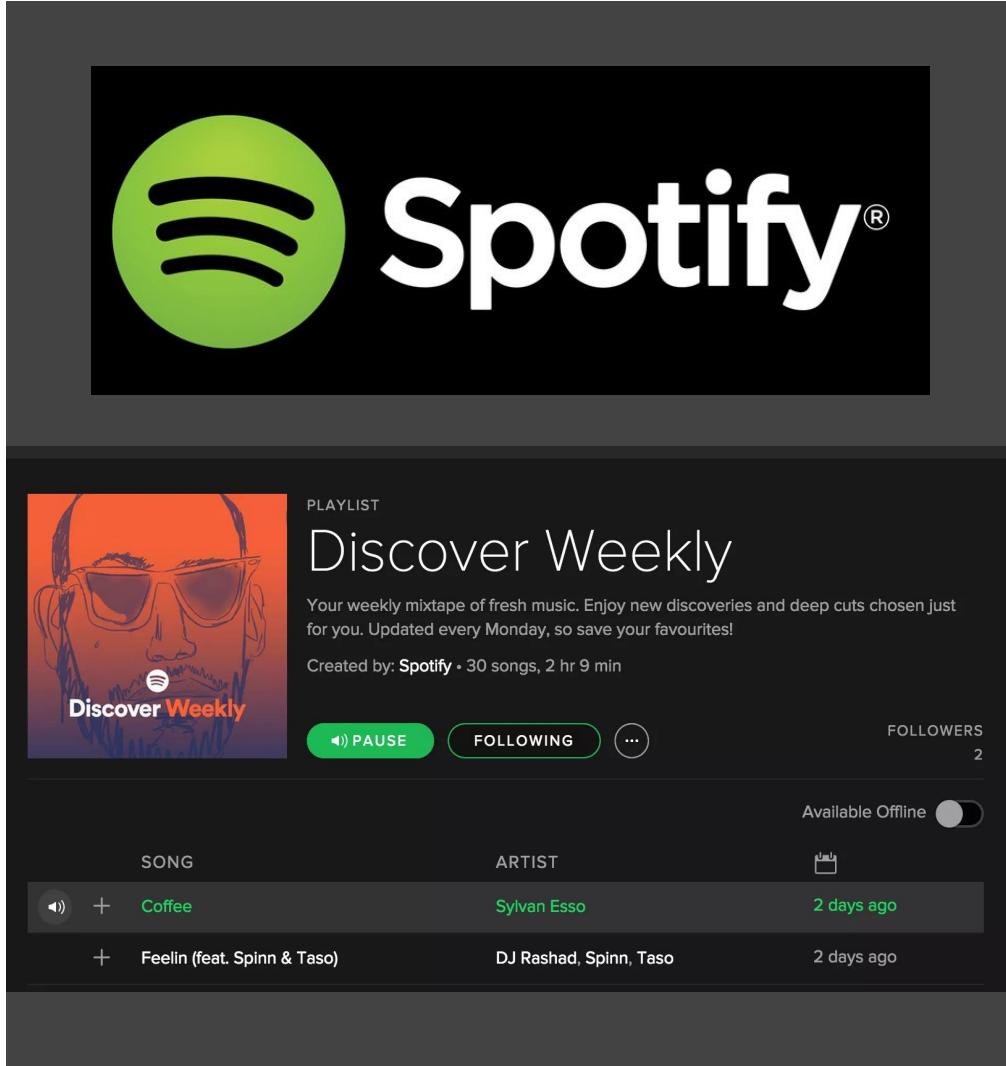
# Applications



**Facebook** puts content on your Newsfeed and advertises products to you intelligently using Machine Learning.

How is Facebook Intelligent?

# Applications



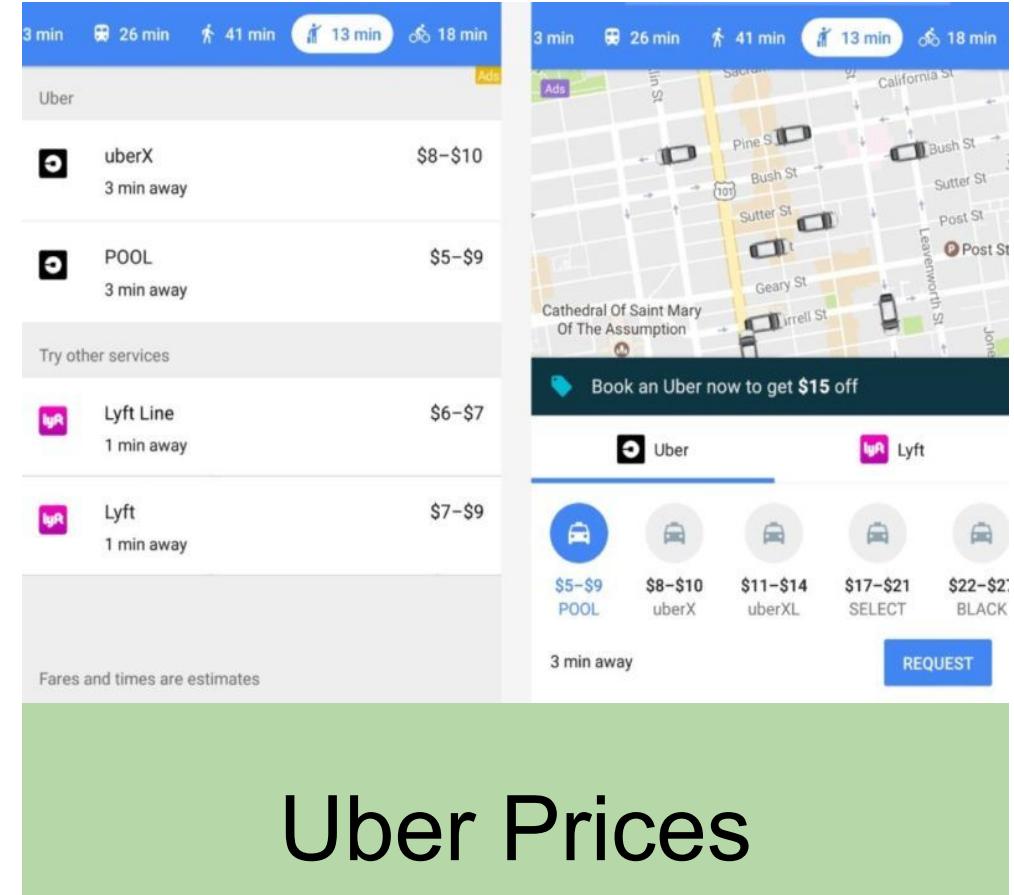
**Spotify** learns your preferences & filters music lists for you intelligently using Machine Learning.

How is Spotify Intelligent?

# OTHER AI APPLICATIONS



Self Driving Cars



# OTHER AI APPLICATIONS



cats like|

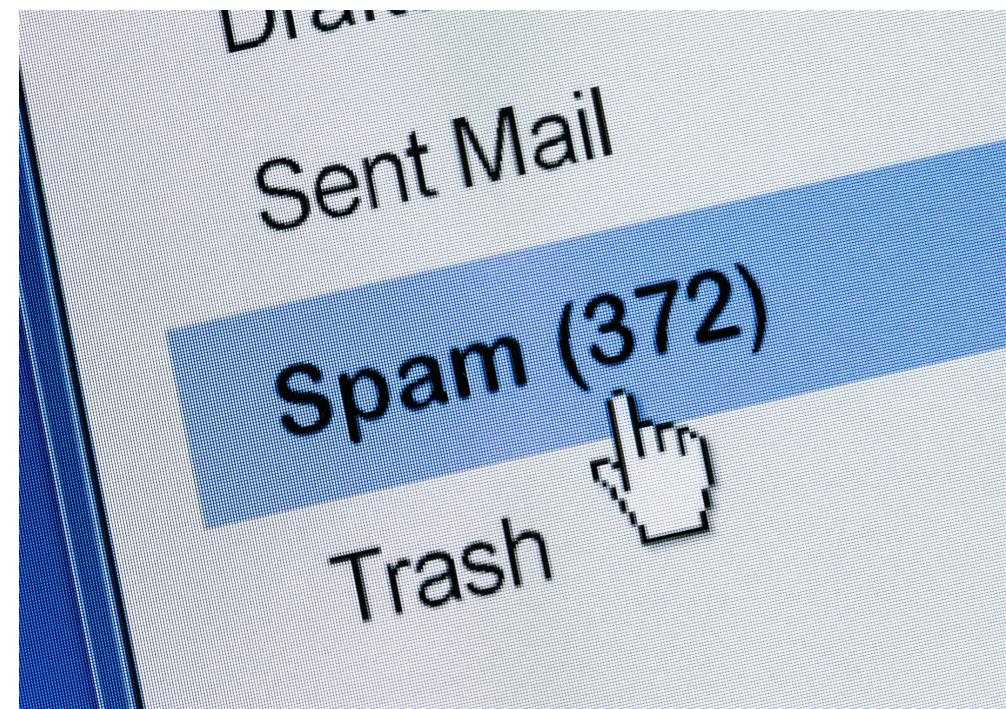
cats like **felix**  
cats like **ear wax**  
cats like **water**  
**cats like hitler**  
cats like **music**  
cats like **assessments**  
cats like **mint**  
cats like **olives**  
cats like **tigers**  
cats like **beer**

Google Search

I'm Feeling Lucky

[Advanced Search](#)  
[Preferences](#)  
[Language Tools](#)

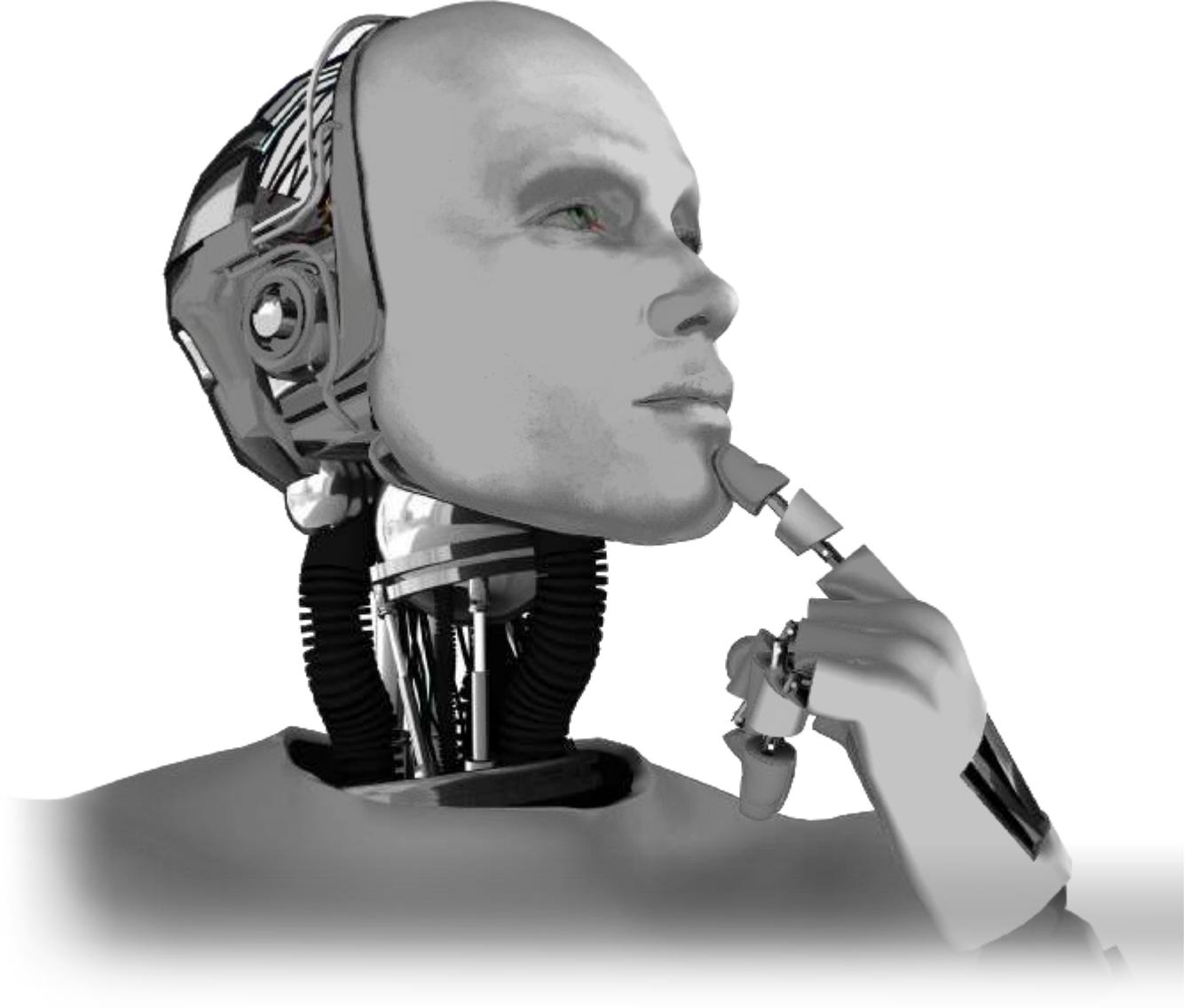
Google Search results



Email Spam Filter

# Agenda

- Definition
- Applications
- Classification
  - problem
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  - systems
- Conclusion
- Lets test ourselves!



# CLASSIFICATION

My ideal  
girlfriend or  
boyfriend should  
be...

Is she Chinese  
or Taiwanese?

Should I wear a  
skirt or shorts  
with this shirt?

Everyday, all the time we are classifying things.

# **Classification is a Computable Problem**

**Example 1:** Crossing the street:

- Is there a car coming?
- At what speed?
- How far is it to the other side?

Classification: **Safe to cross or Not safe to cross!!!**

# Classification is a Computable Problem

**Example 1:** Crossing the street:

- Is there a car coming? YES
- At what speed? 80km/hour
- How far is it to the other side? 100 meters

Classification? **Not safe to cross!!!**

# **Classification is a Computable Problem**

## **Example 2: Nationality:**

- Does she only speak English?
- Only knows American music?
- Says “bless you” when someone sneezes?

**Classification: American or Not American!!**

# Classification is a Computable Problem

## Example 2: Nationality:

- Does she only speak English? NO
- Only knows American music? YES
- Says “bless you” when someone sneezes? YES

Classification? American

# Classification is a Computable Problem

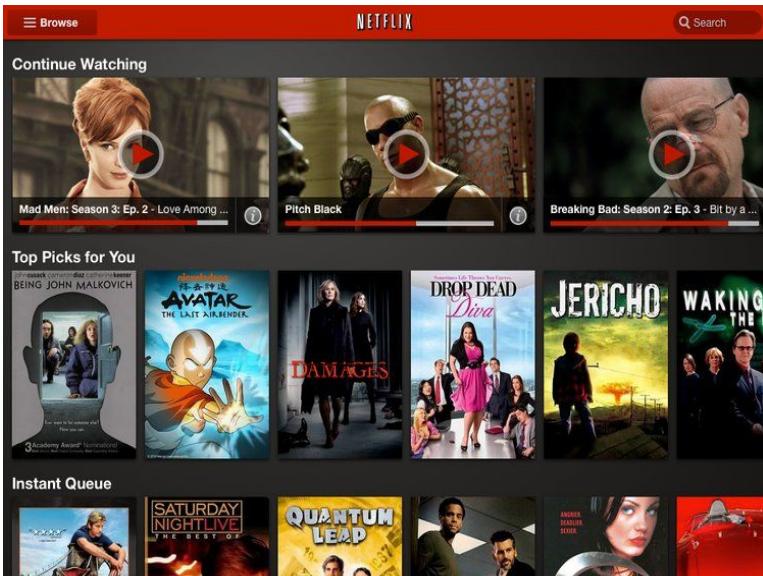
**Example 3:** Netflix is always computing movies that a user might like:



**Classification: Nitah will enjoy this movie or Not!!!**

# Classification is a Computable Problem

**Example 3:** Assuming Nitah rarely watches horror and there's a movie that:



- Is not in “My Top Picks” section
- Has a rating of 54%
- Is a horror movie

Classification? Nitah will NOT enjoy this movie

# **CLASSIFICATION SYSTEMS**

1. Nearest Neighbors (kNNs)
2. Identification trees (ID Trees)
3. Neural Nets
4. Support Vector Machines  
(SVMs)

# To classify, Learning comes first

## LEARNING

Have:

Data of all students in this class with their description e.g language spoken, favorite food and nationality

Goal:

Get to know what features distinguish a Korean from a Taiwanese

## CLASSIFYING

Have:

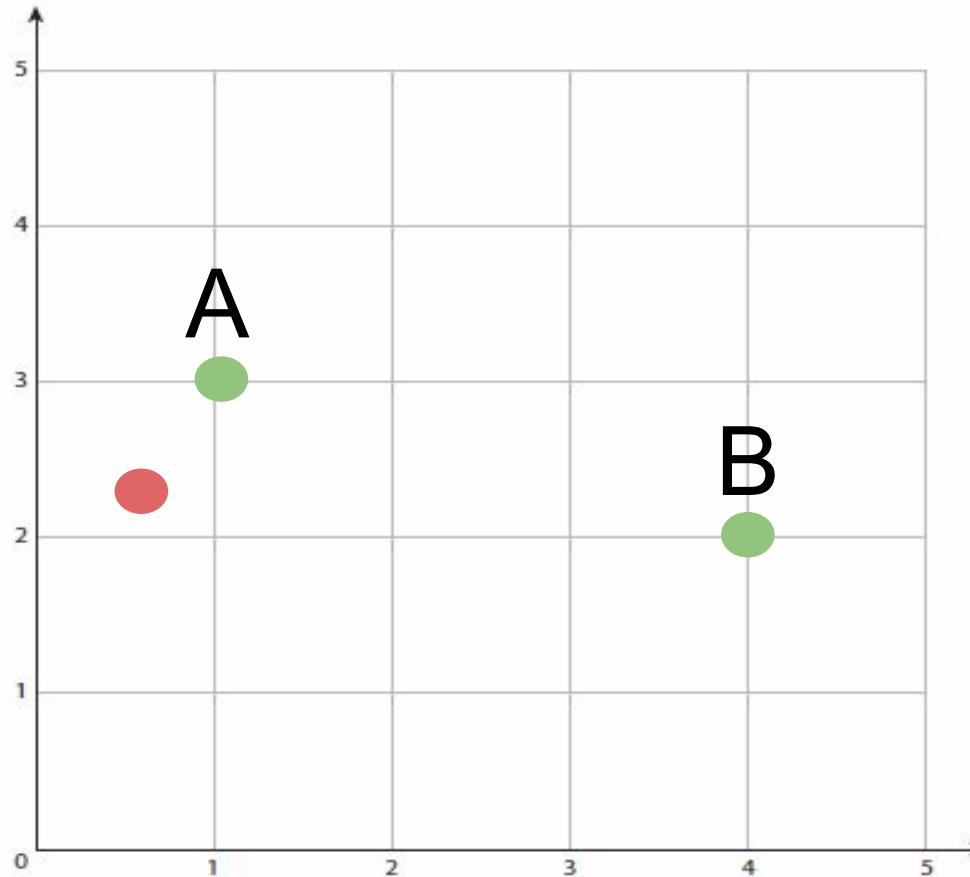
A new student with a list of their description e.g Chris speaks Korean and likes kimchi soup

Goal:

Determine if Chris is Korean or Taiwanese

# 1. Nearest Neighbors (kNNs)

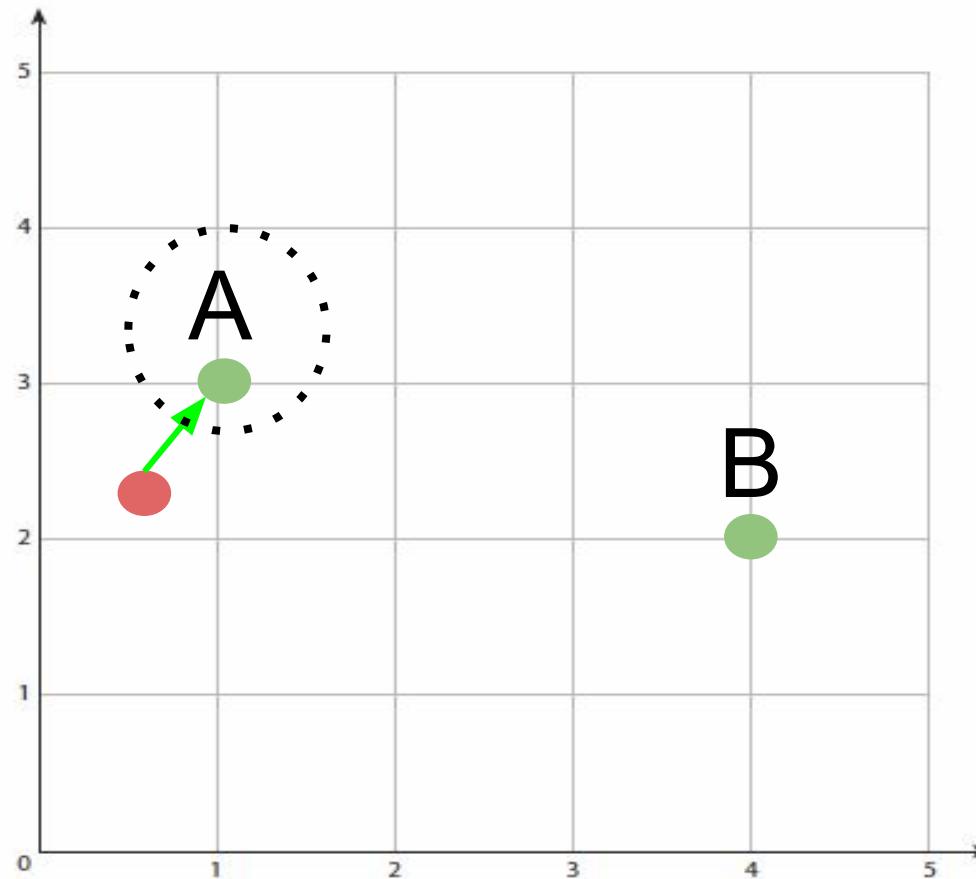
A new item is classified based on the nearest neighbor(s)



**GOAL:** Classify the red point as either type A or B?

# Nearest Neighbors: 1-NN

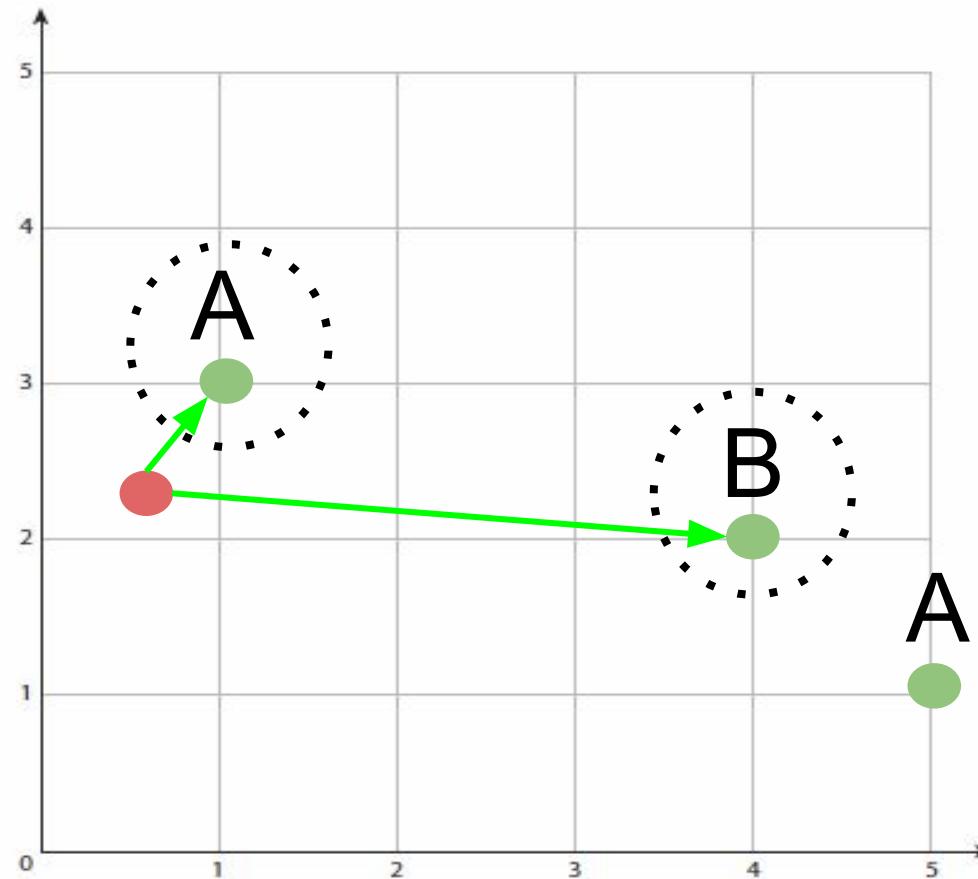
1-NN classifies a new item based on one “the nearest” neighbor



ANSWER: Type A

# Nearest Neighbors: 2-NN

2-NN classifies a new item based on two “nearest” neighbors

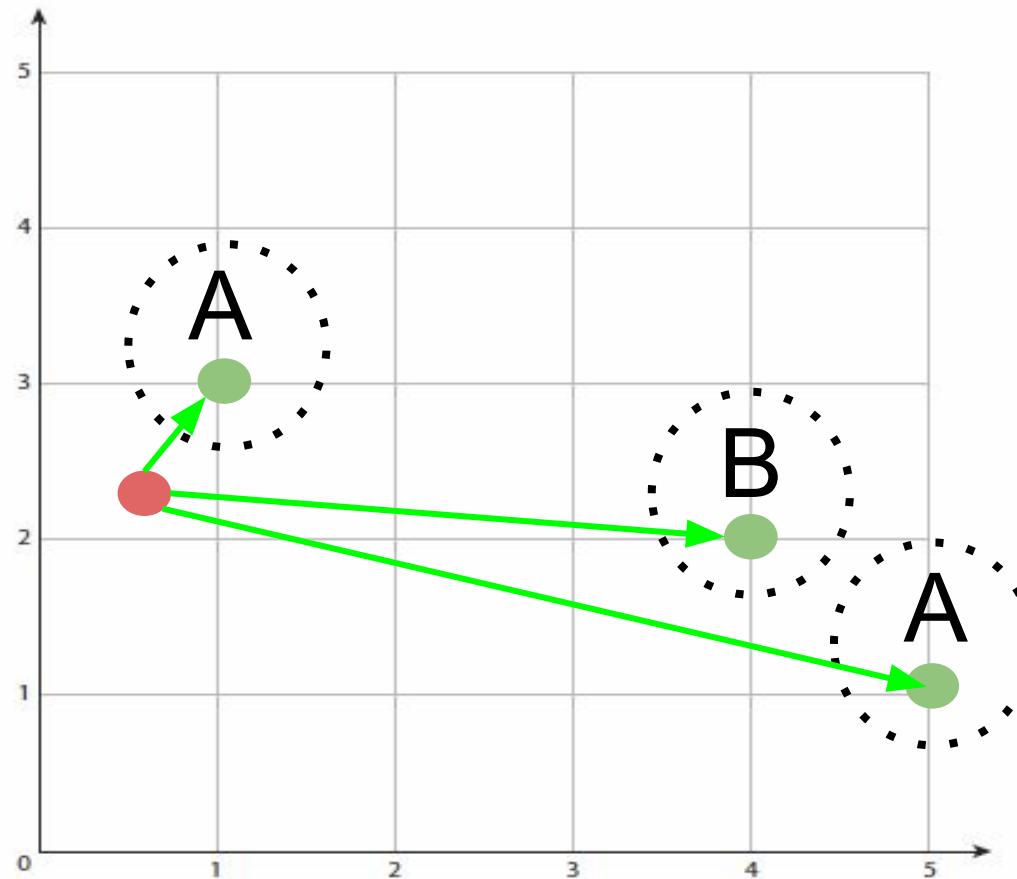


ANSWER:

Tie/None/Not sure

# Nearest Neighbors: 3-NN

3-NN classifies a new item based on three “nearest” neighbors

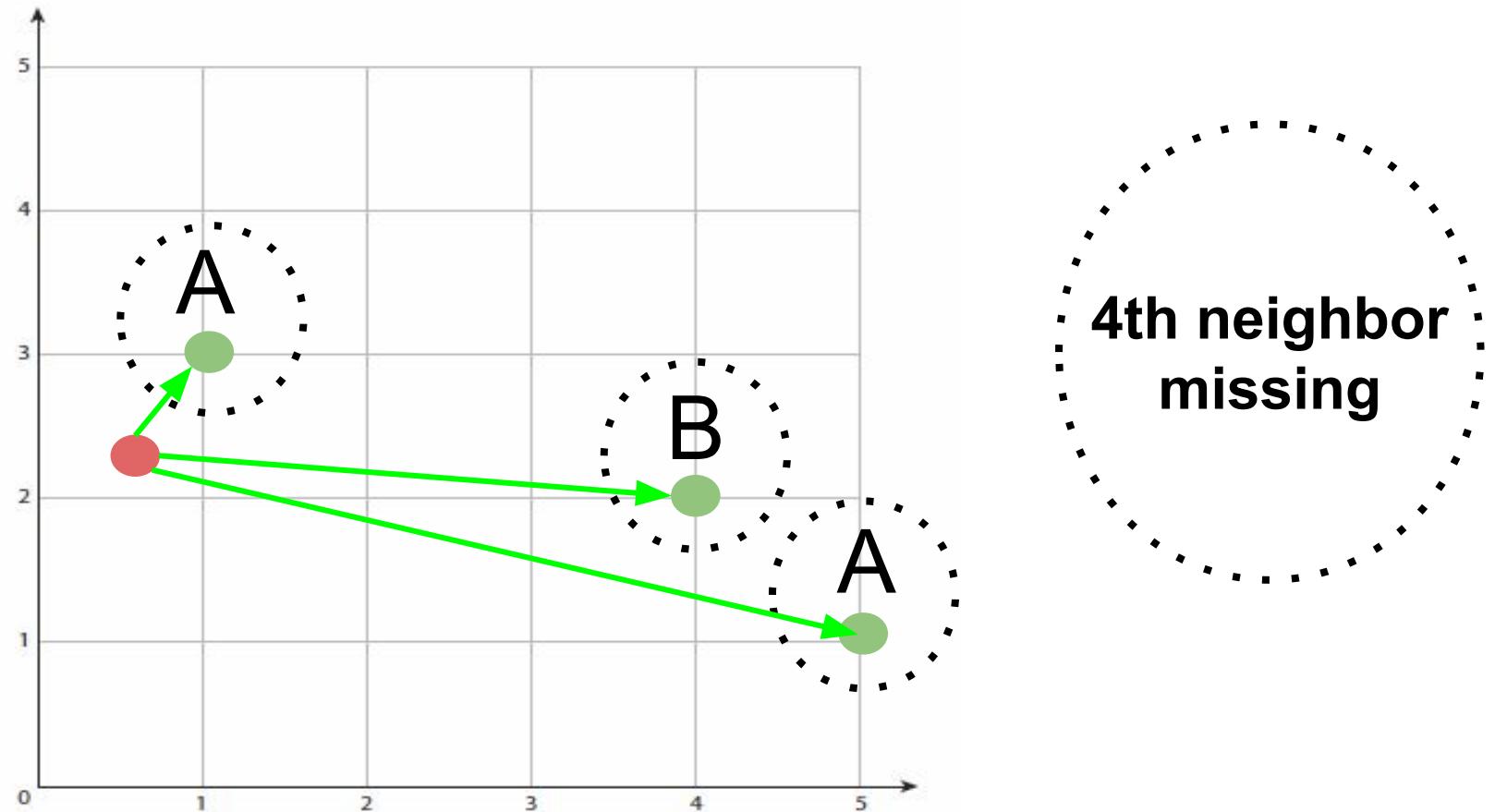


ANSWER:

Type A

# Nearest Neighbors: 4-NN

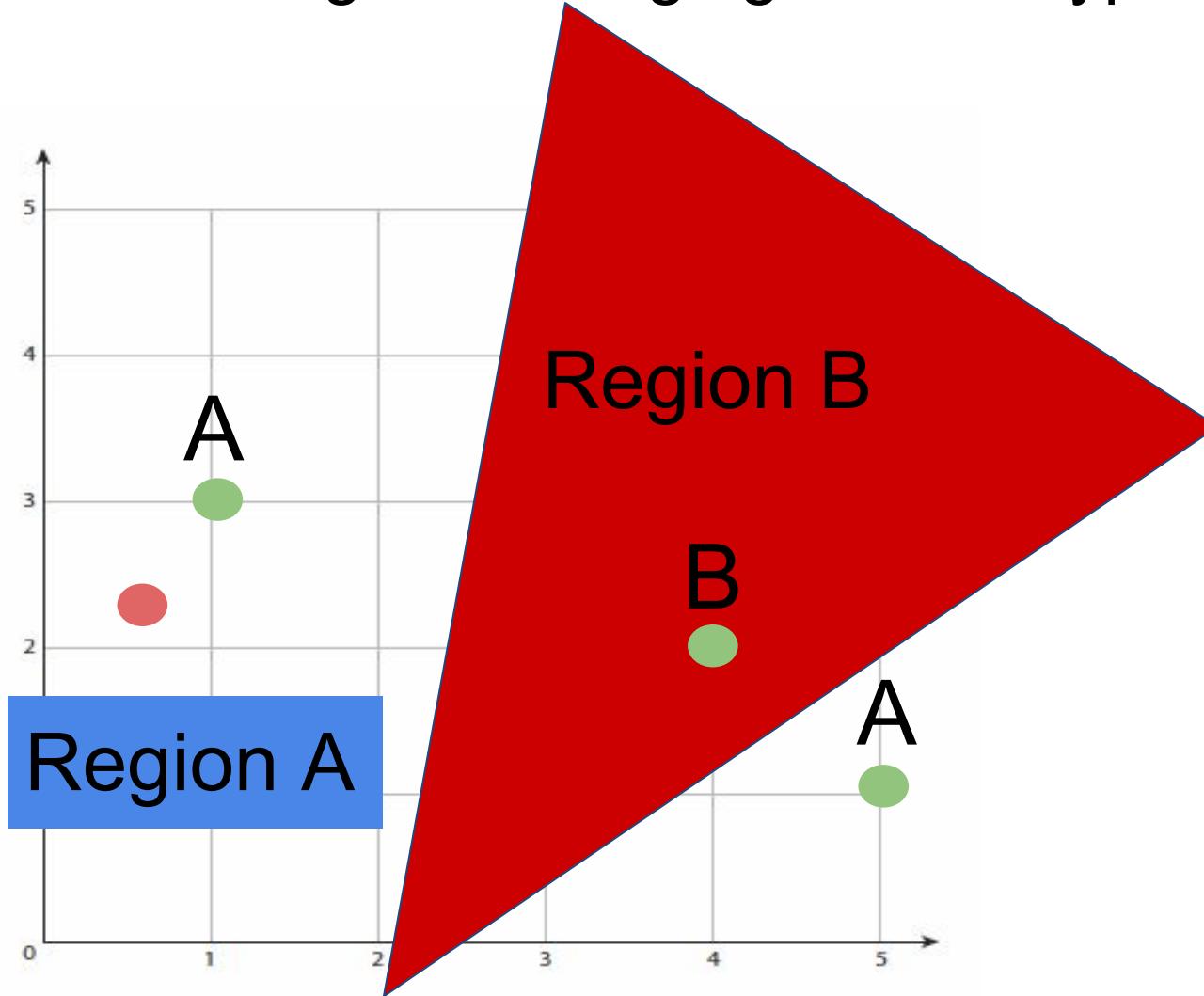
4-NN classifies a new item based on four “nearest” neighbors



ANSWER: **Unknown**

# How a computer classifies using kNNs

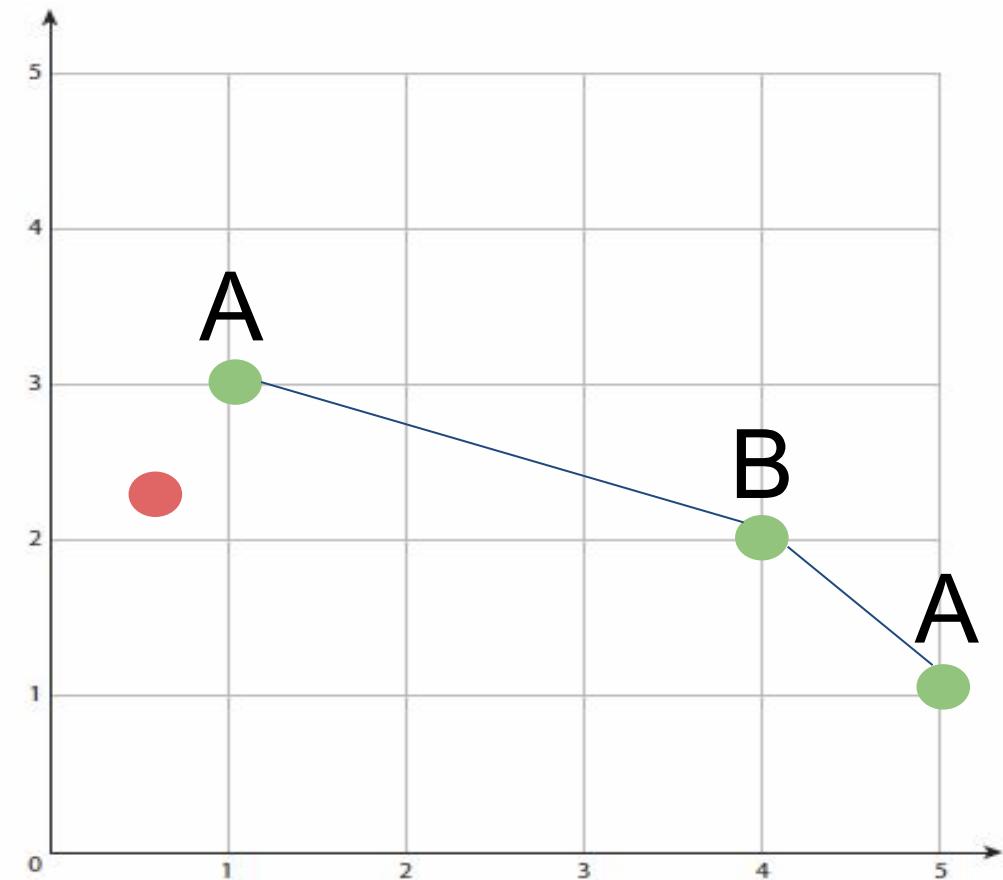
It computes the region belonging to each type



# How a computer classifies using kNNs

It computes the region belonging to each type

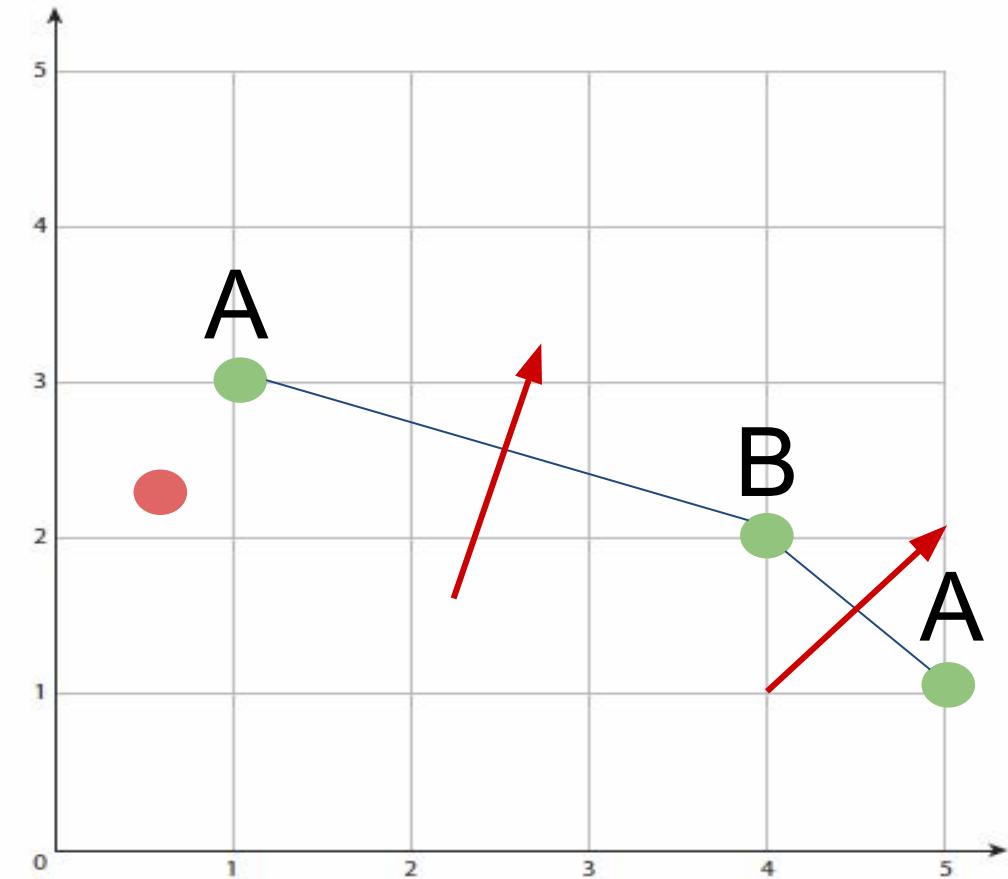
**STEP 1:** For each pair of different points, draw a straight line joining the two points



# How a computer classifies using kNNs

It computes the region belonging to each type

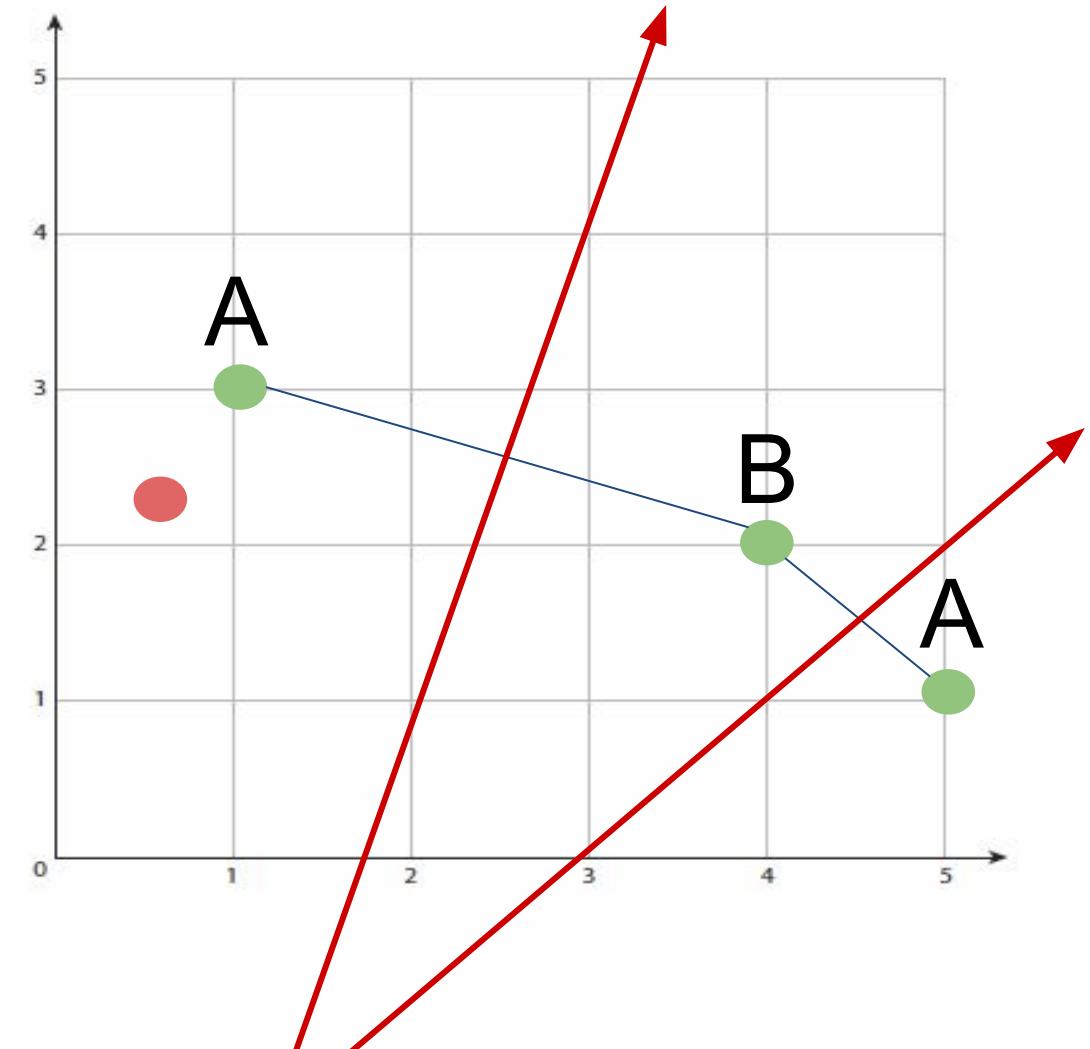
**STEP 2:** Draw the perpendicular bisectors of the lines



# How a computer classifies using kNNs

It computes the region belonging to each type

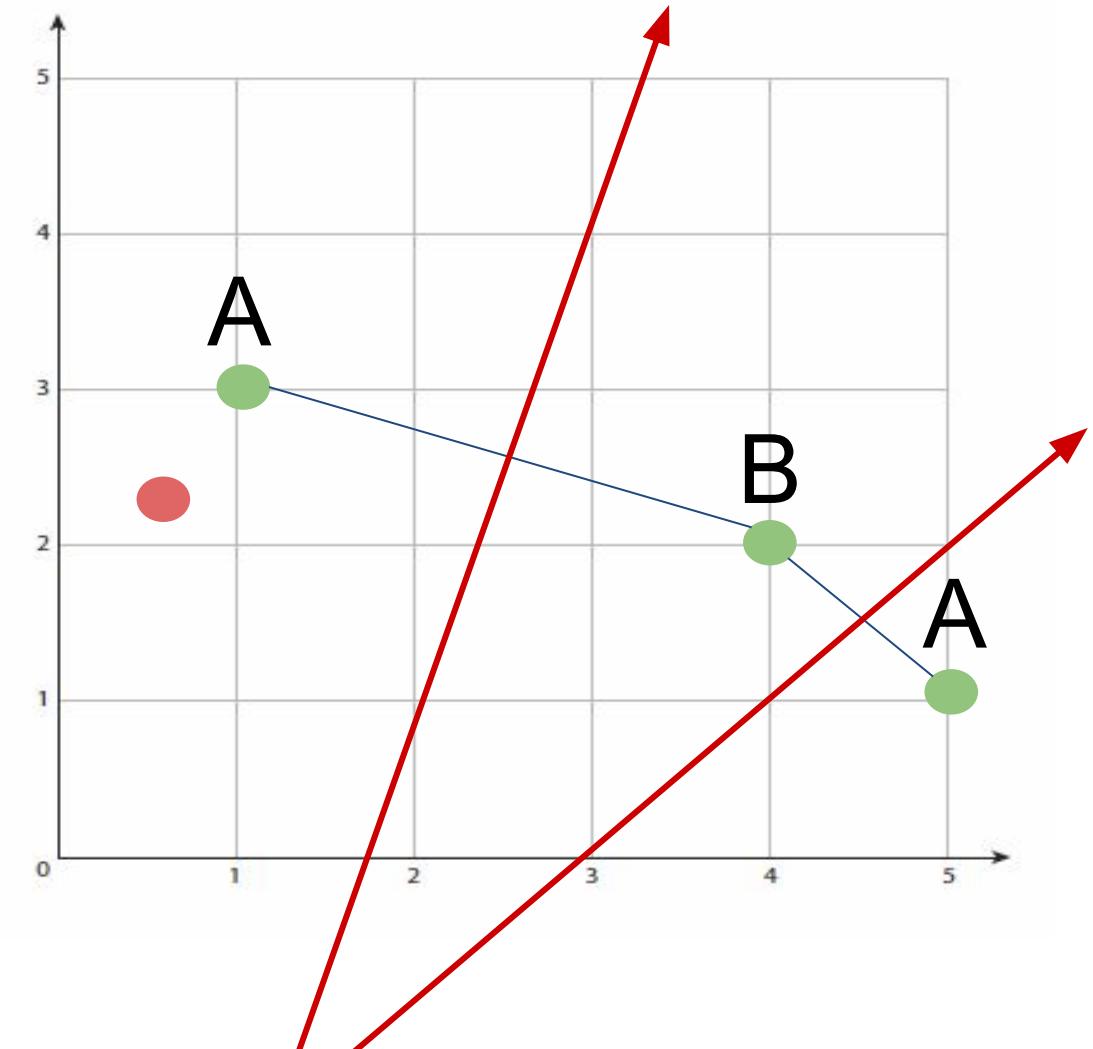
**STEP 3:** Extend the perpendicular bisectors



# How a computer classifies using kNNs

It computes the region belonging to each type

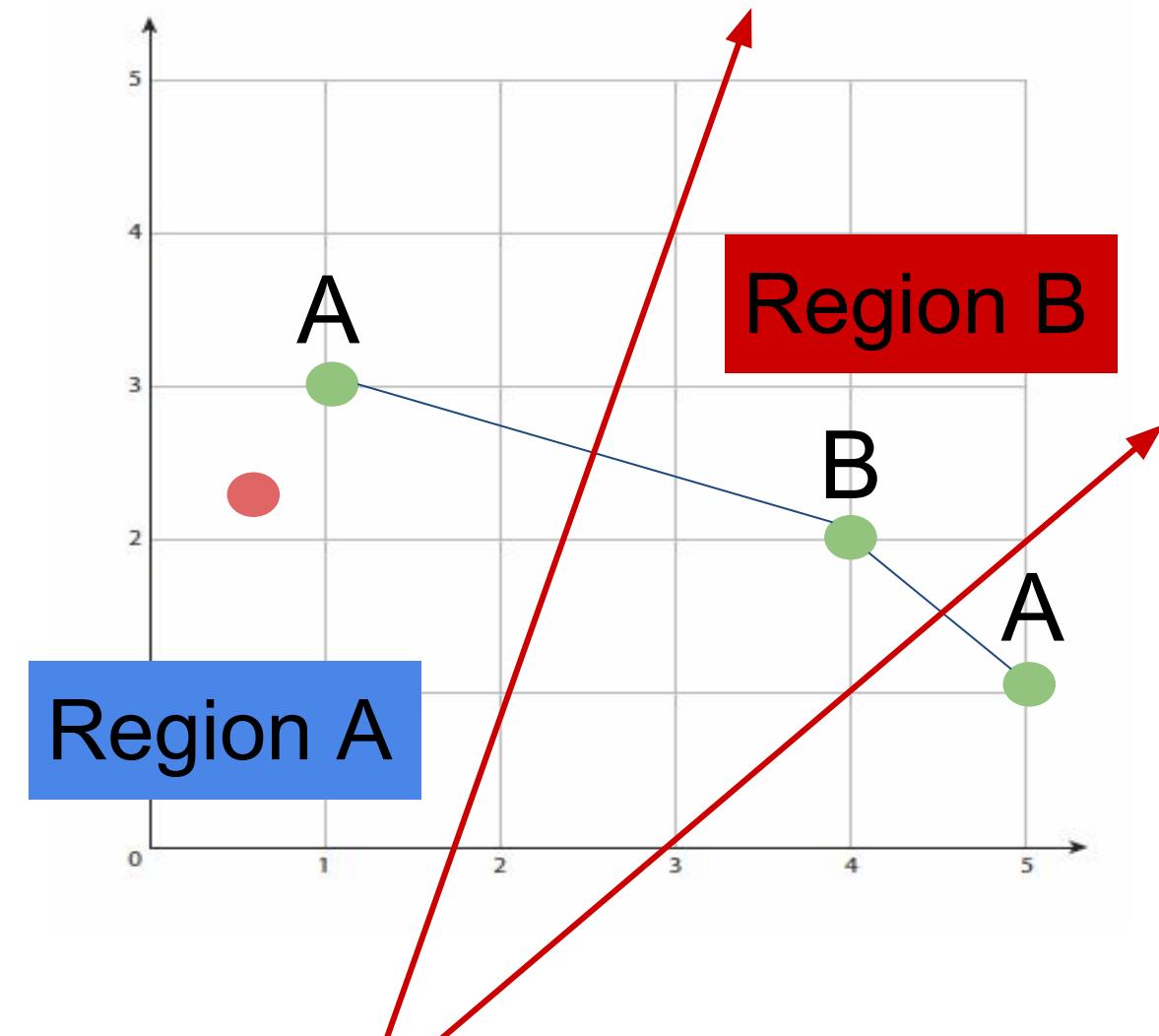
**STEP 3:** Extend the perpendicular bisectors



# How a computer classifies using kNNs

Region A is now clear from Region B

The red point is type A



## **2. Identification Trees**

- A simple representation for classifying items into classes
- Also called a decision tree

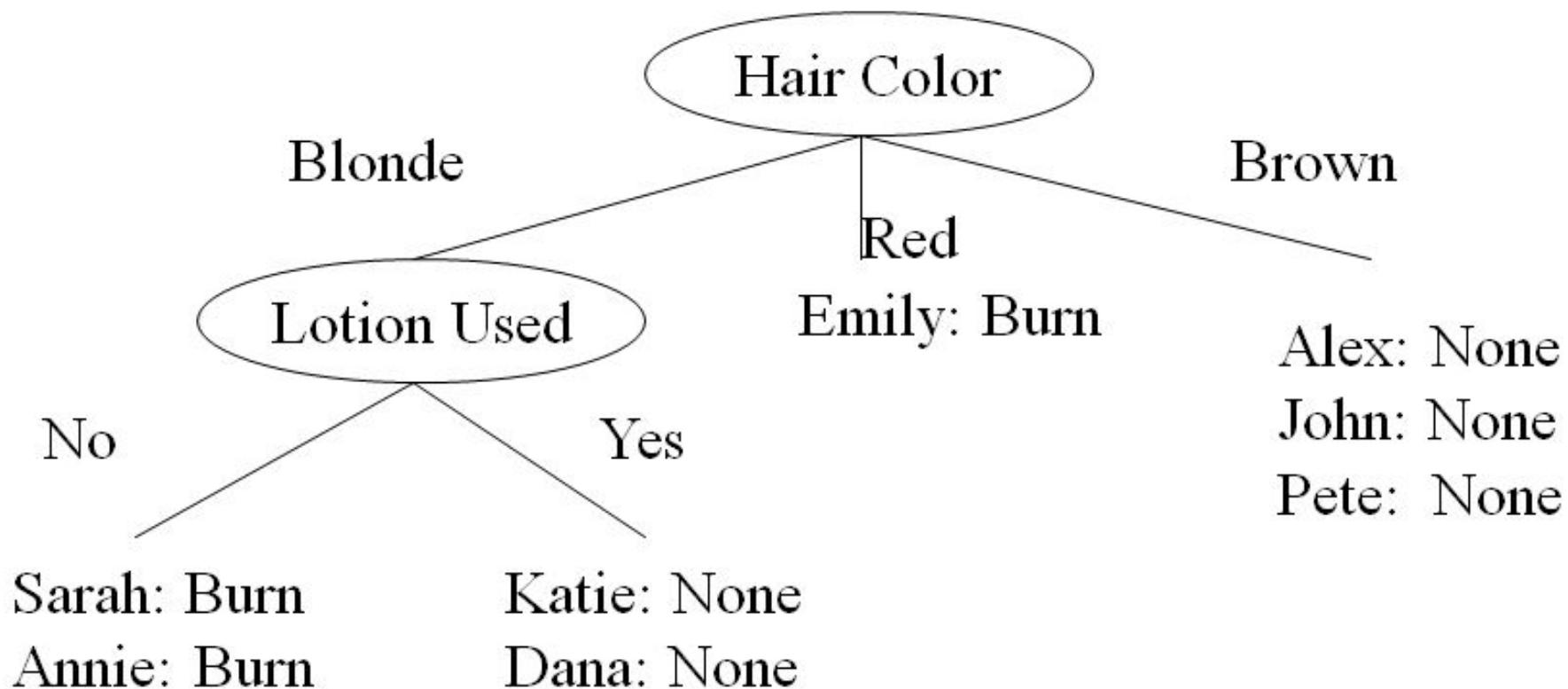
**GOAL:** Find a set of rules for classifying a new item

# Identification Trees: Sunburn Example

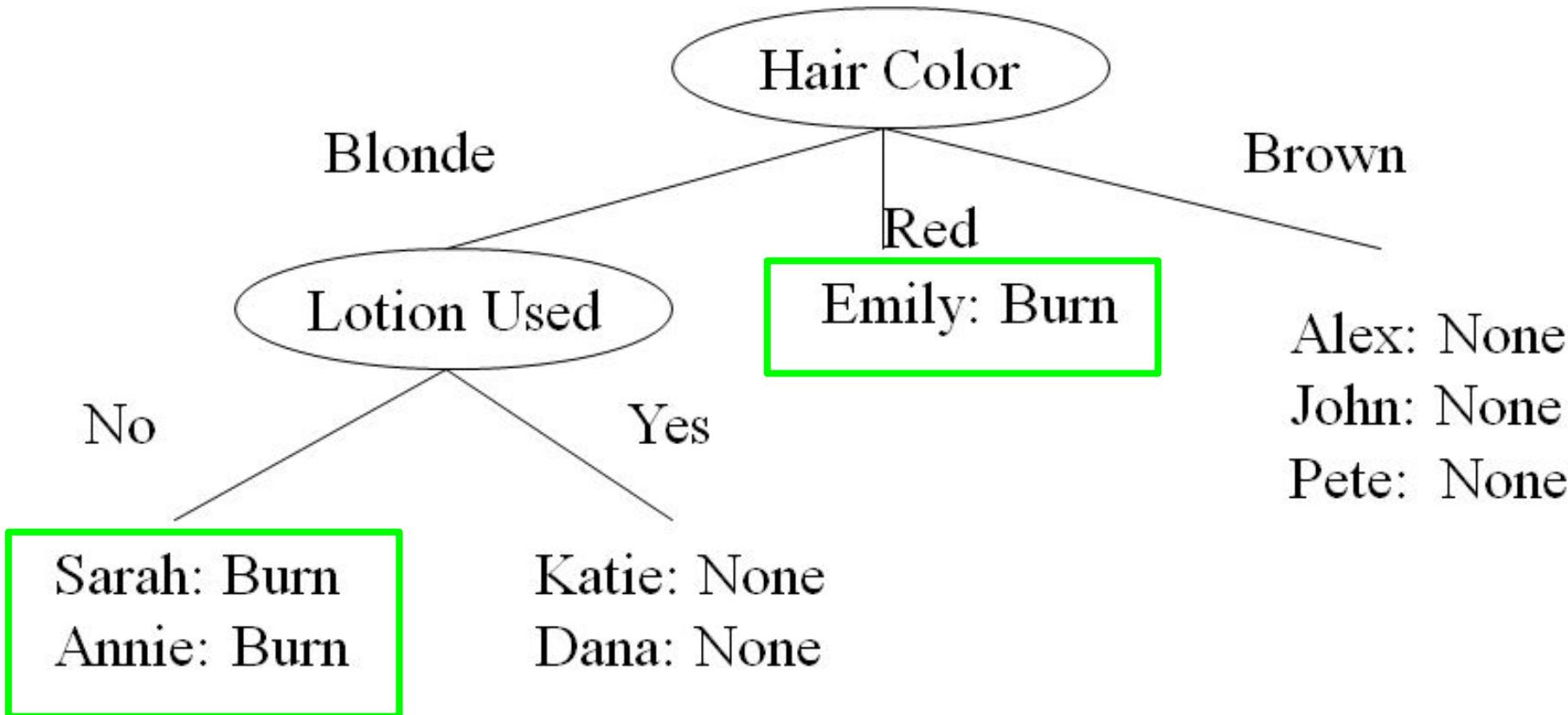
Name	Hair	Height	Weight	Lotion	Result
Sarah	Blonde	Average	Light	No	Burn
Dana	Blonde	Tall	Average	Yes	None
Alex	Brown	Short	Average	Yes	None
Annie	Blonde	Short	Average	No	Burn
Emily	Red	Average	Heavy	No	Burn
Pete	Brown	Tall	Heavy	No	None
John	Brown	Average	Heavy	No	None
Katie	Blonde	Short	Light	Yes	None

**QUESTION:** What features make you get a sunburn?

# Sunburn Identification Tree

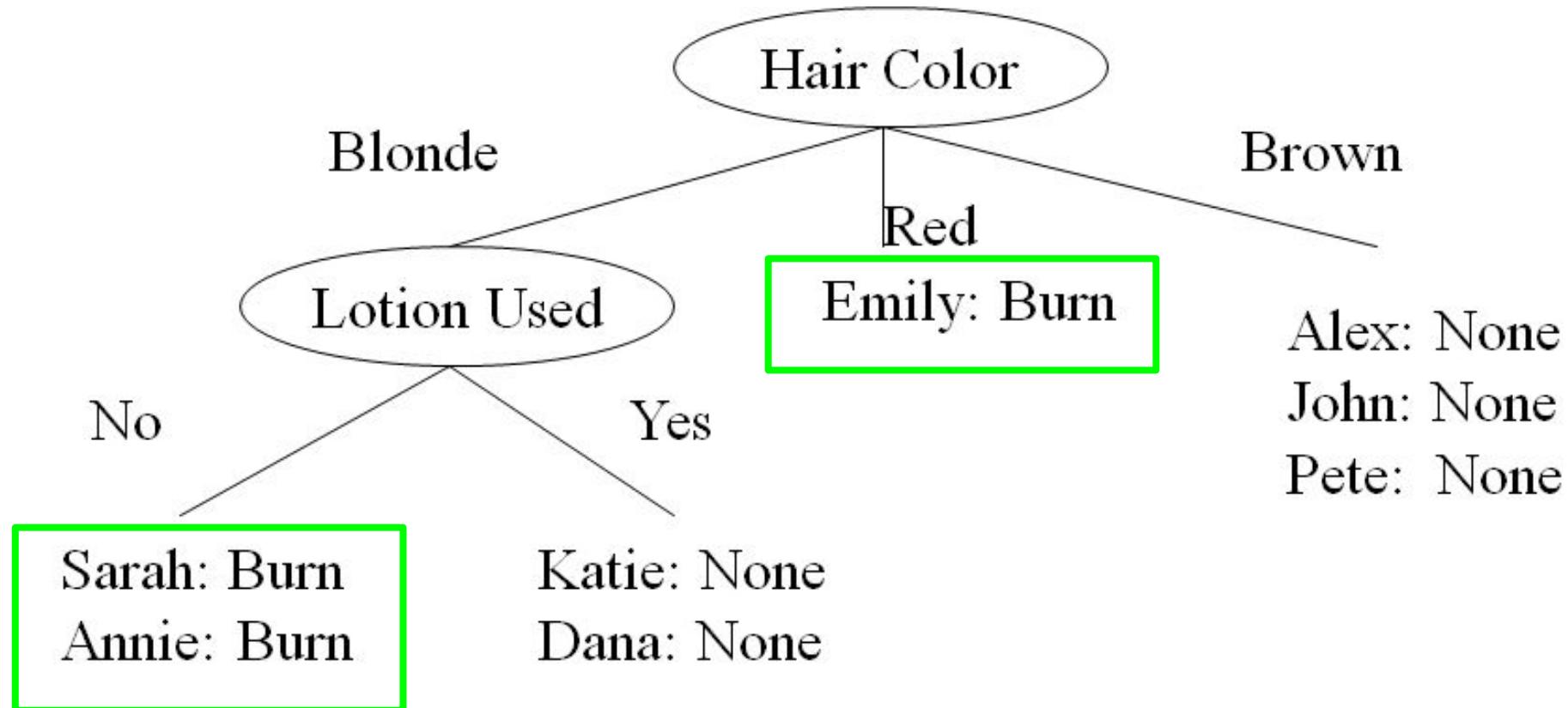


# Sunburn Identification Tree



- RULES:**
1. If red hair -> sunburn
  2. If blonde hair and lotion not used -> sunburn

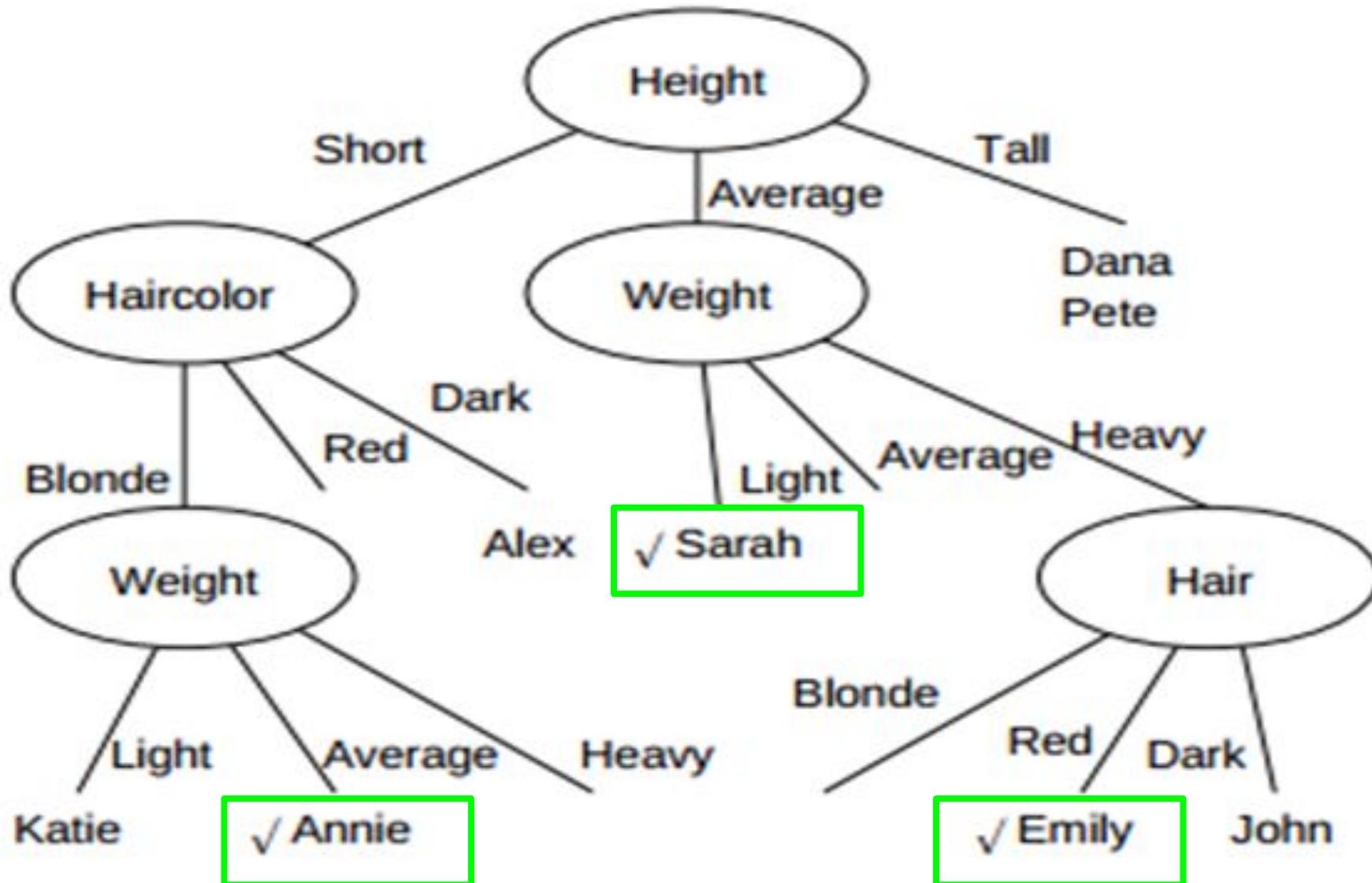
# Why did the ID tree use Hair Color as the root feature?



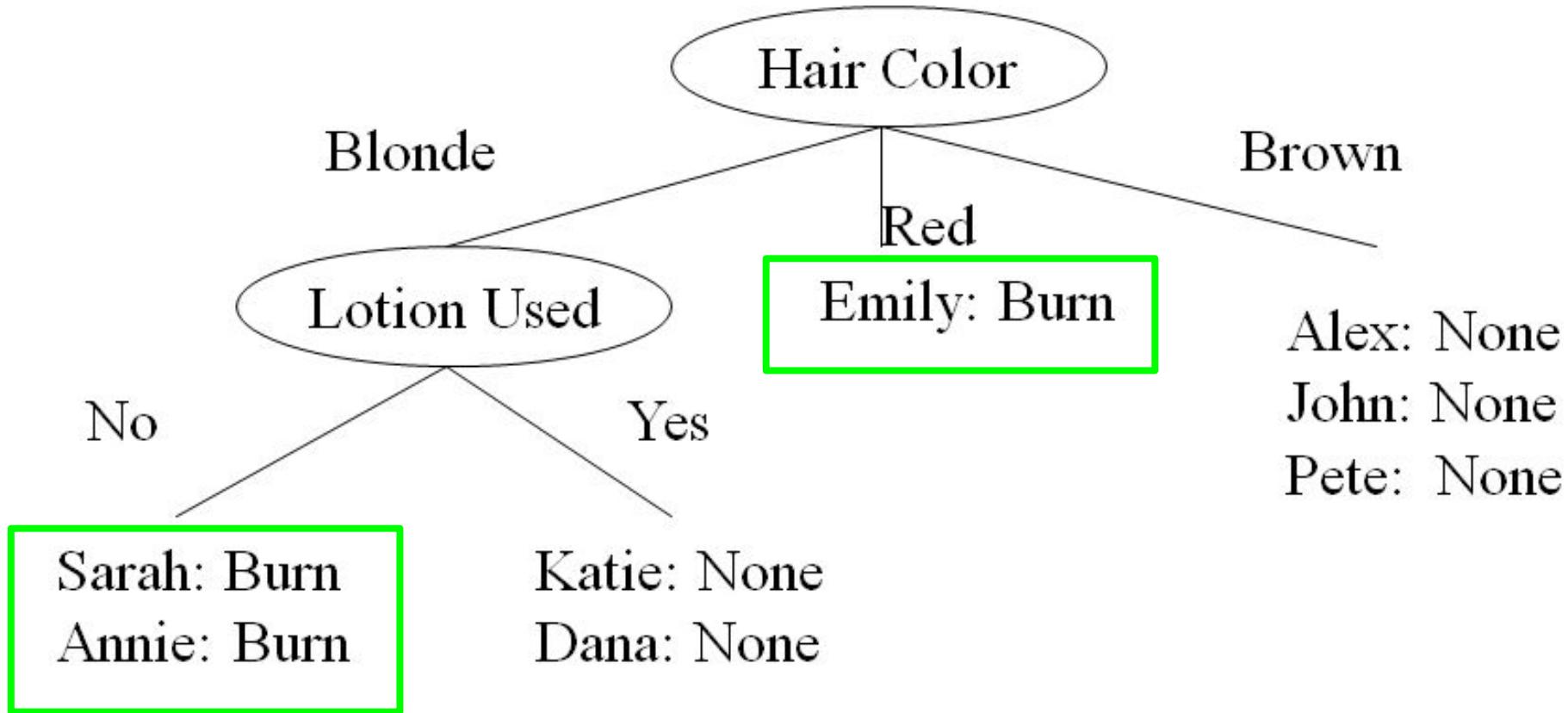
# Why did the ID tree use Hair Color as the root feature?

Name	Hair	Height	Weight	Lotion	Result
Sarah	Blonde	Average	Light	No	Burn
Dana	Blonde	Tall	Average	Yes	None
Alex	Brown	Short	Average	Yes	None
Annie	Blonde	Short	Average	No	Burn
Emily	Red	Average	Heavy	No	Burn
Pete	Brown	Tall	Heavy	No	None
John	Brown	Average	Heavy	No	None
Katie	Blonde	Short	Light	Yes	None

# Height as root feature



# Hair Color as root feature



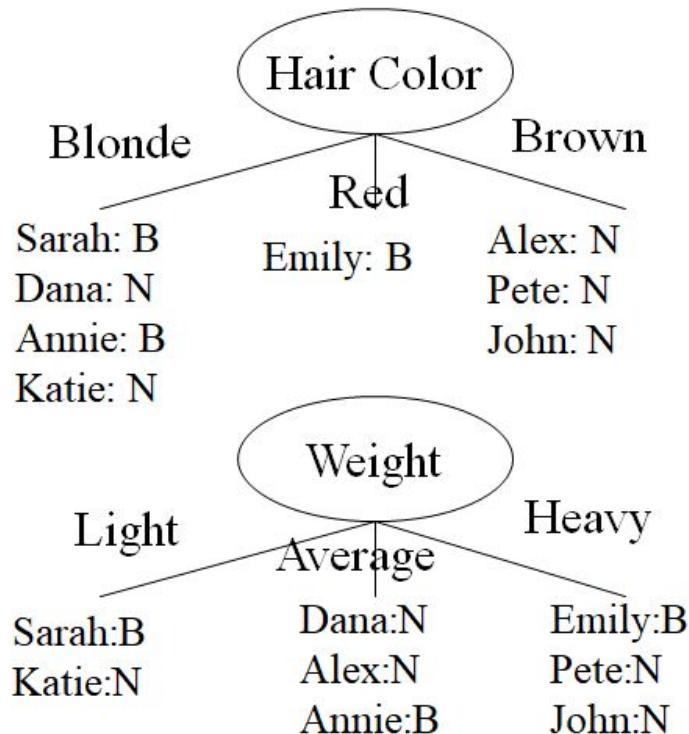
Gives us the smallest tree!

**But why does starting with Hair Color  
give us the smallest tree?**

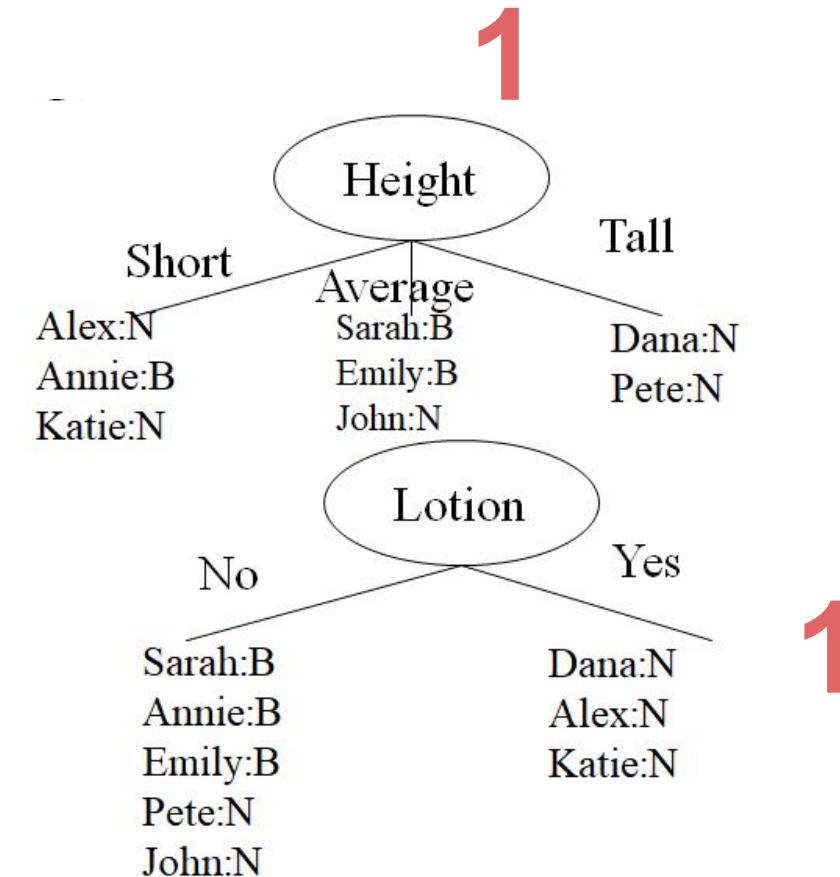
# Because Hair Color has least disorder

Has 2 homogenous branches  
while the rest have 0 or 1

2



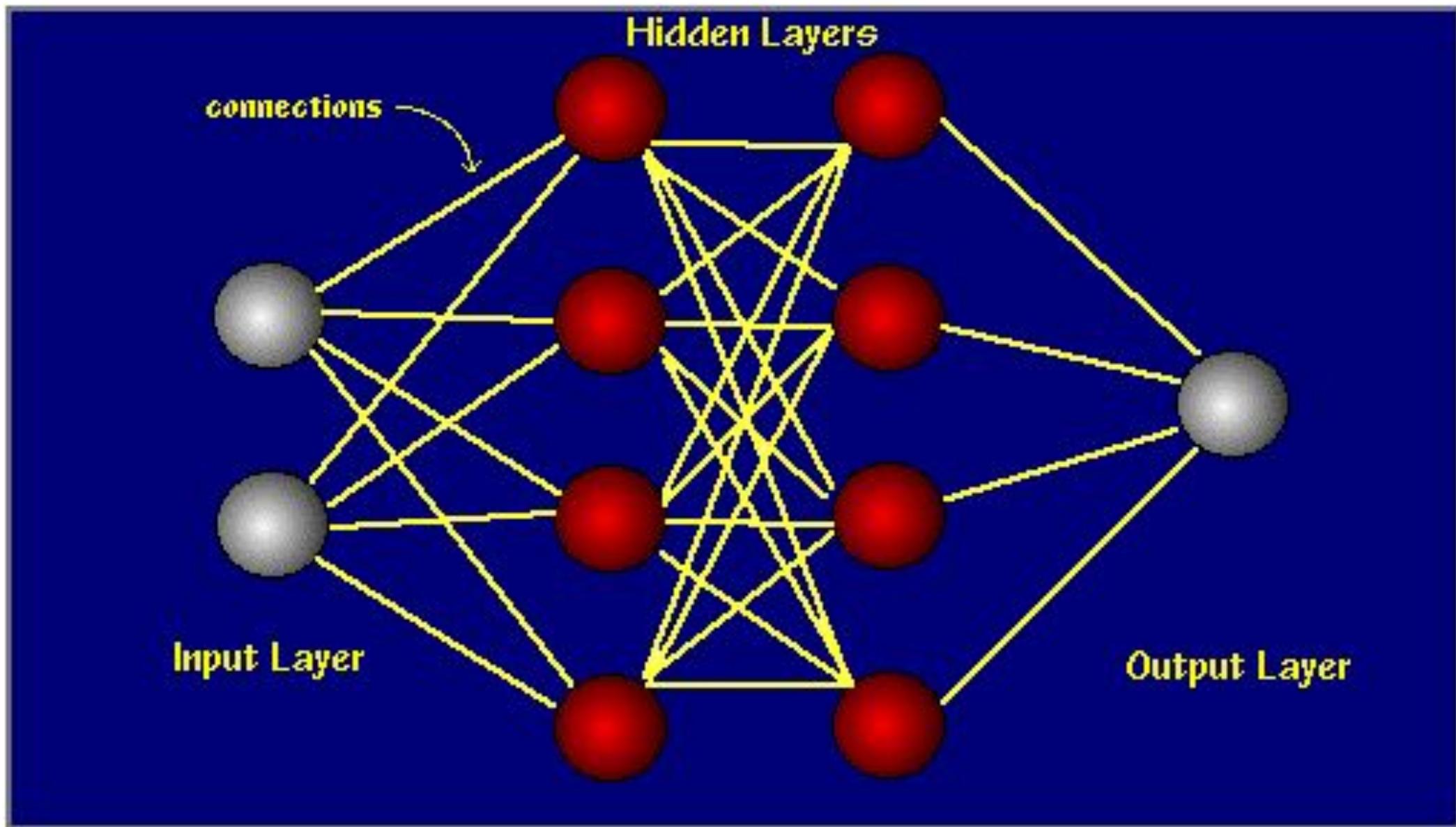
0



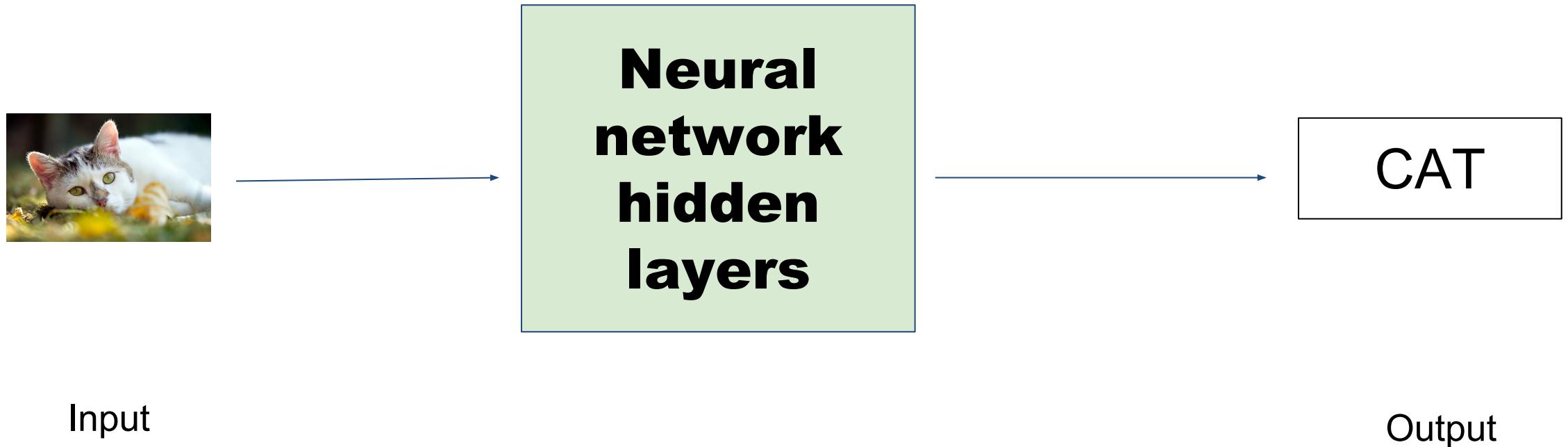
1

1

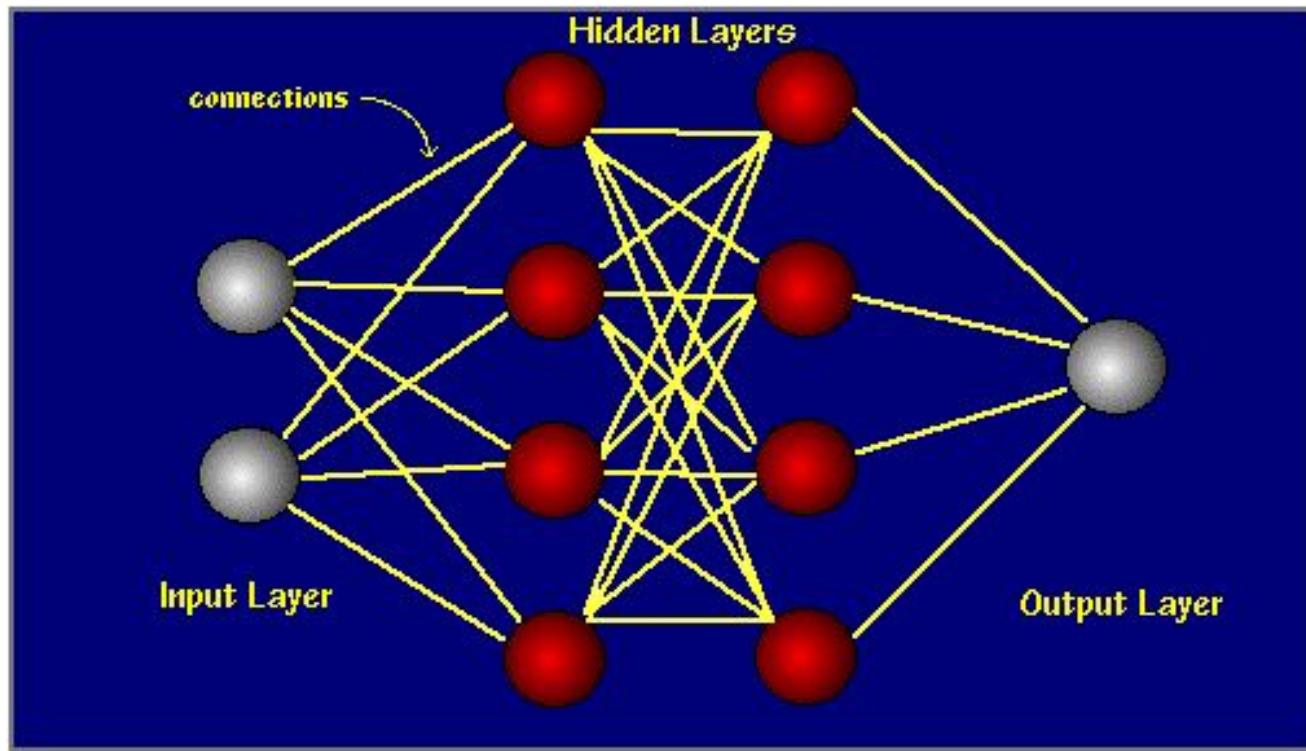
### 3. Neural Networks



# **Neural Networks enable classification**

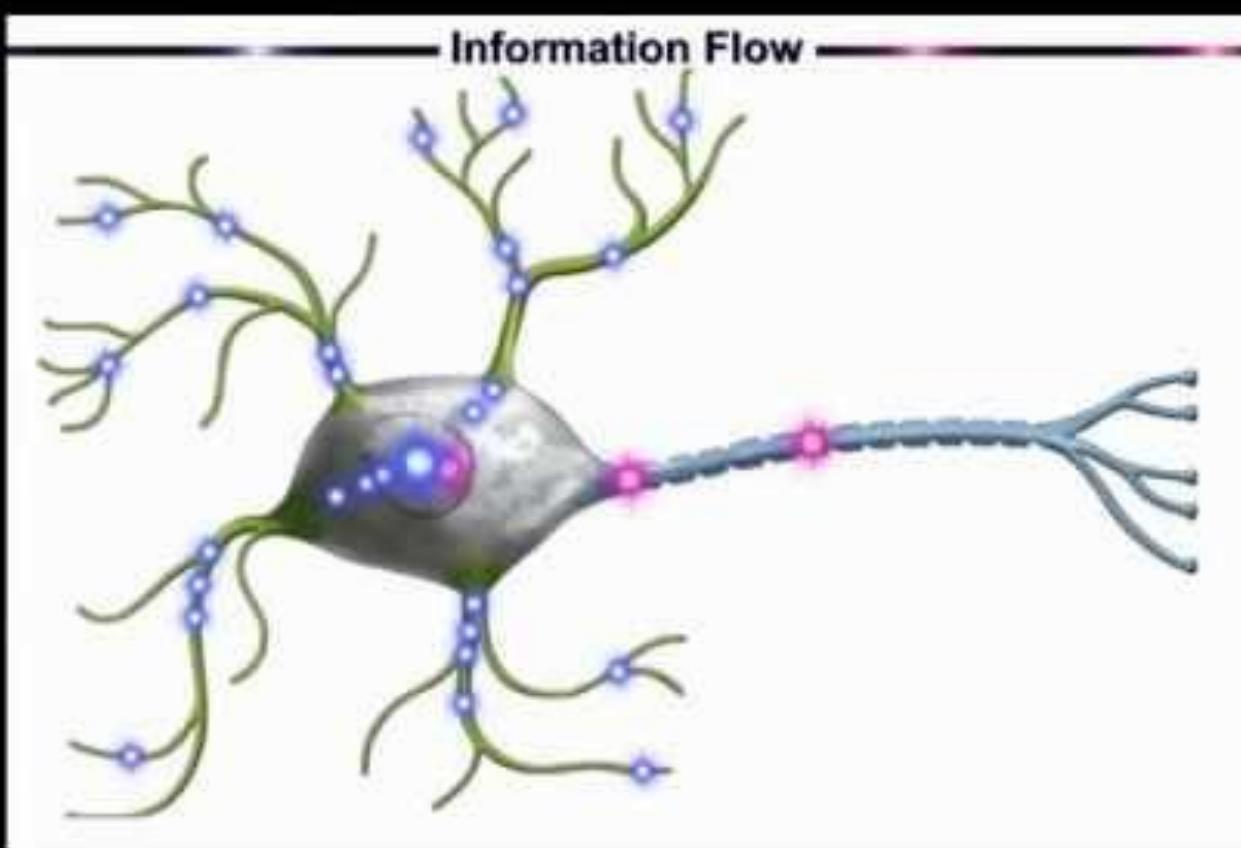


# What is a Neural Network?

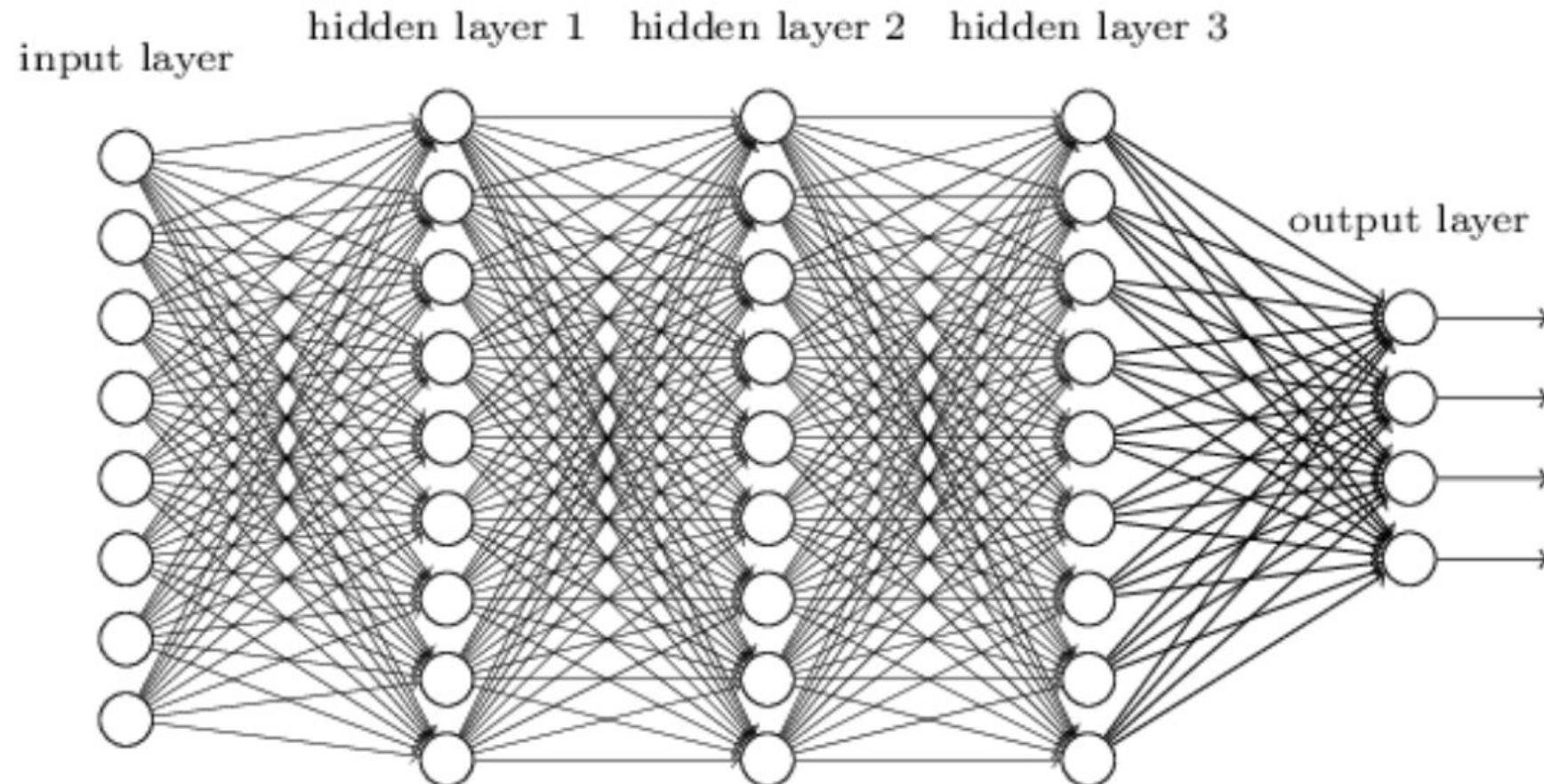


A Neural Net is a series of algorithms that attempts to identify underlying relationships in a data set by using a process that mimics the way the human brain operates.

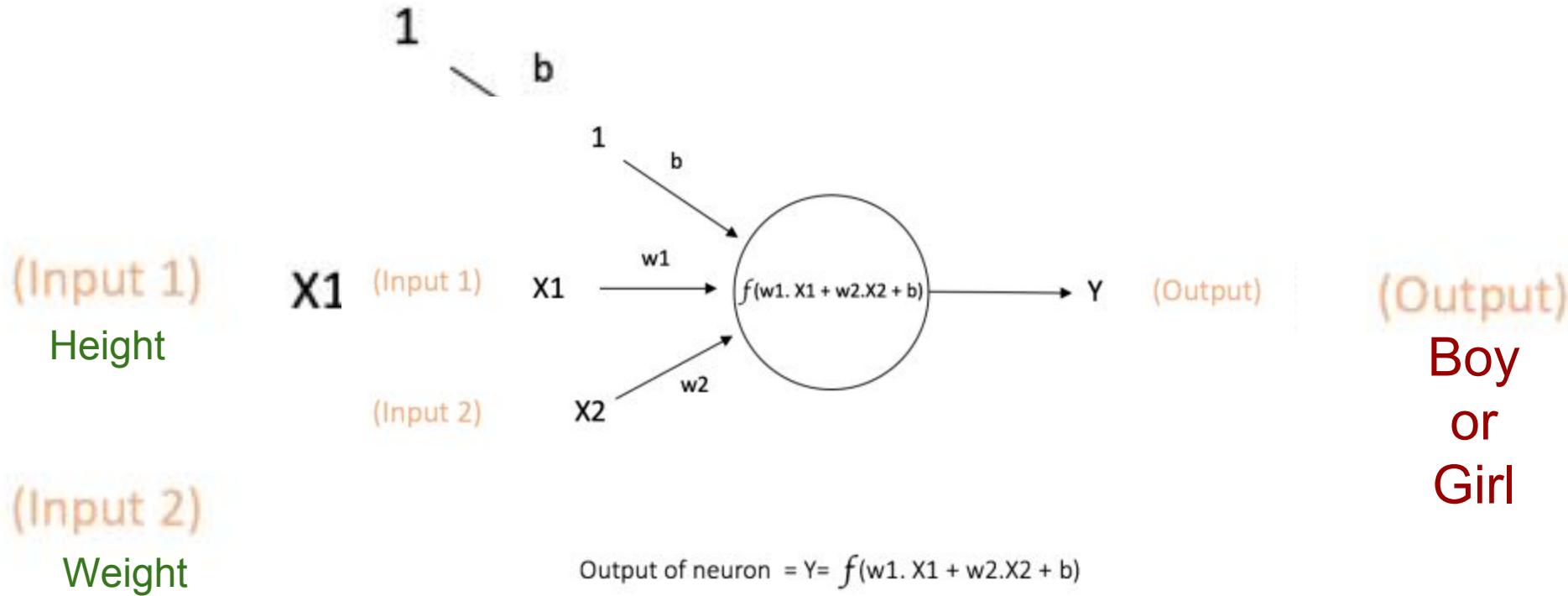
# What is a Neural Network?



# A Neural Net is basically interconnected layers of nodes



# A Neural Net Example



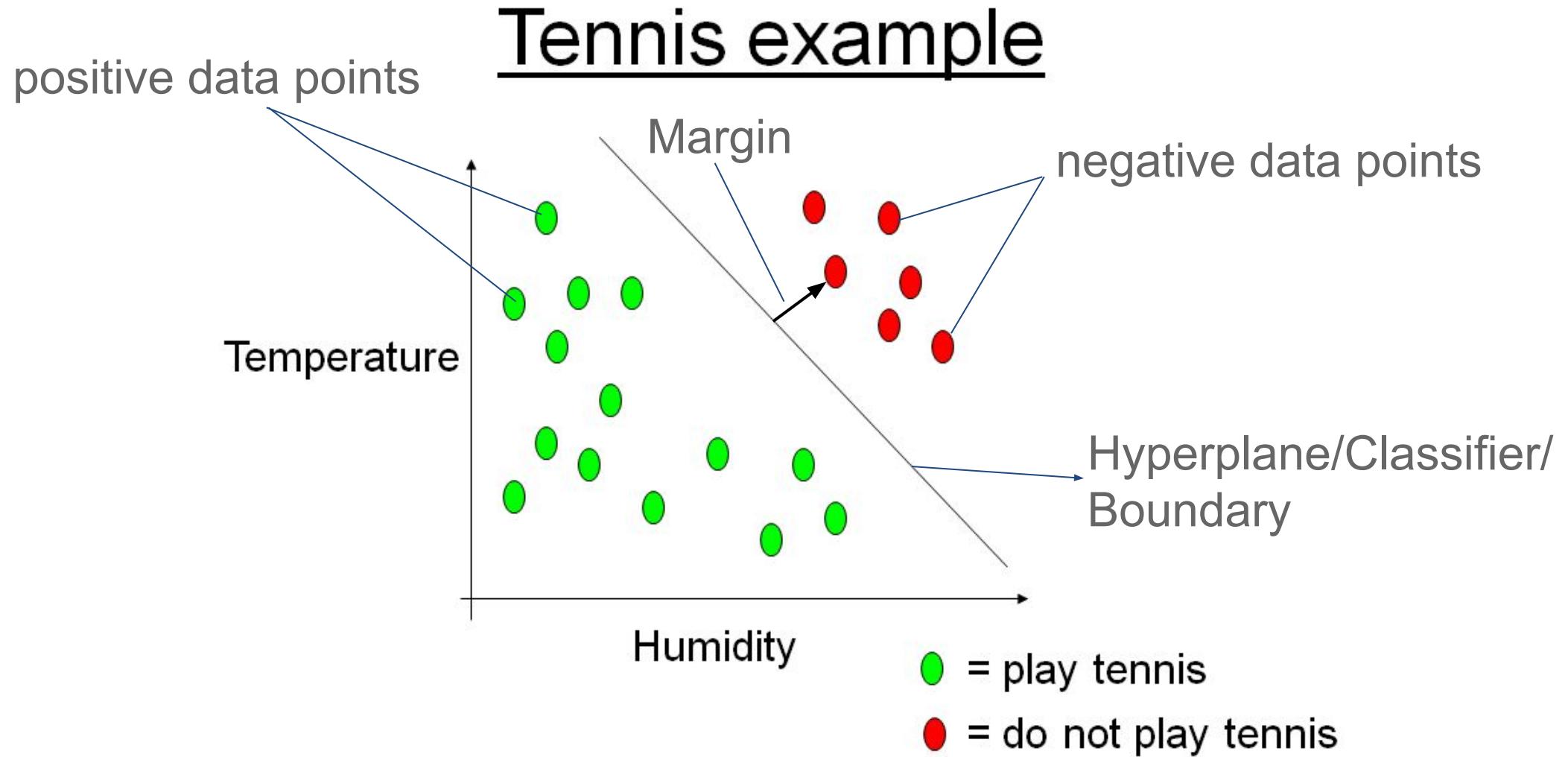
Output of neuron =  $f(w_1 \cdot X_1 + w_2 \cdot X_2 + b)$

# **4. Support Vector Machines (SVMs)**

SVM is a supervised machine learning algorithm used to classify items using a computed hyperplane

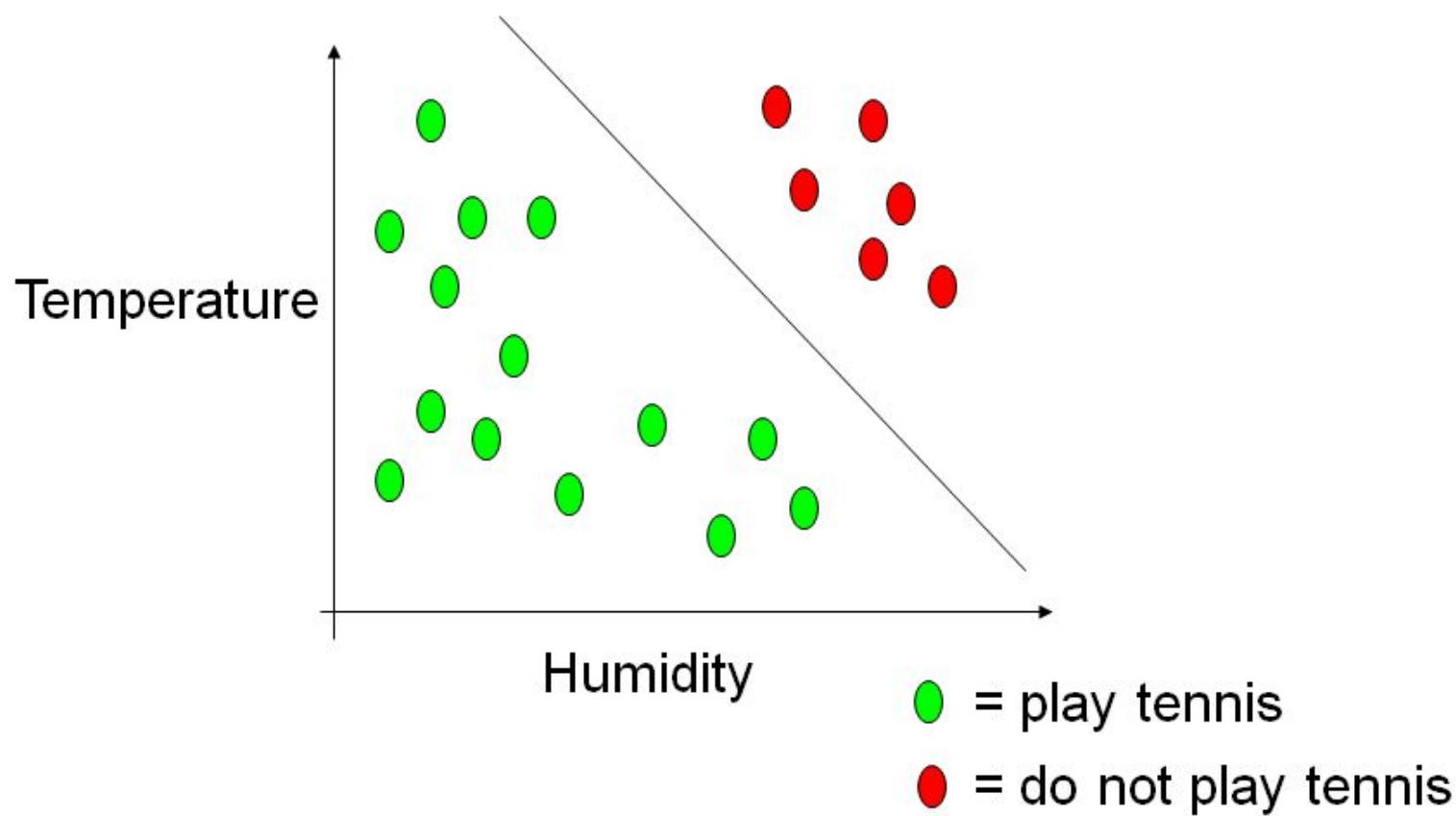
**GOAL:** Find the most optimal boundary/classifier

# SVMs: Example



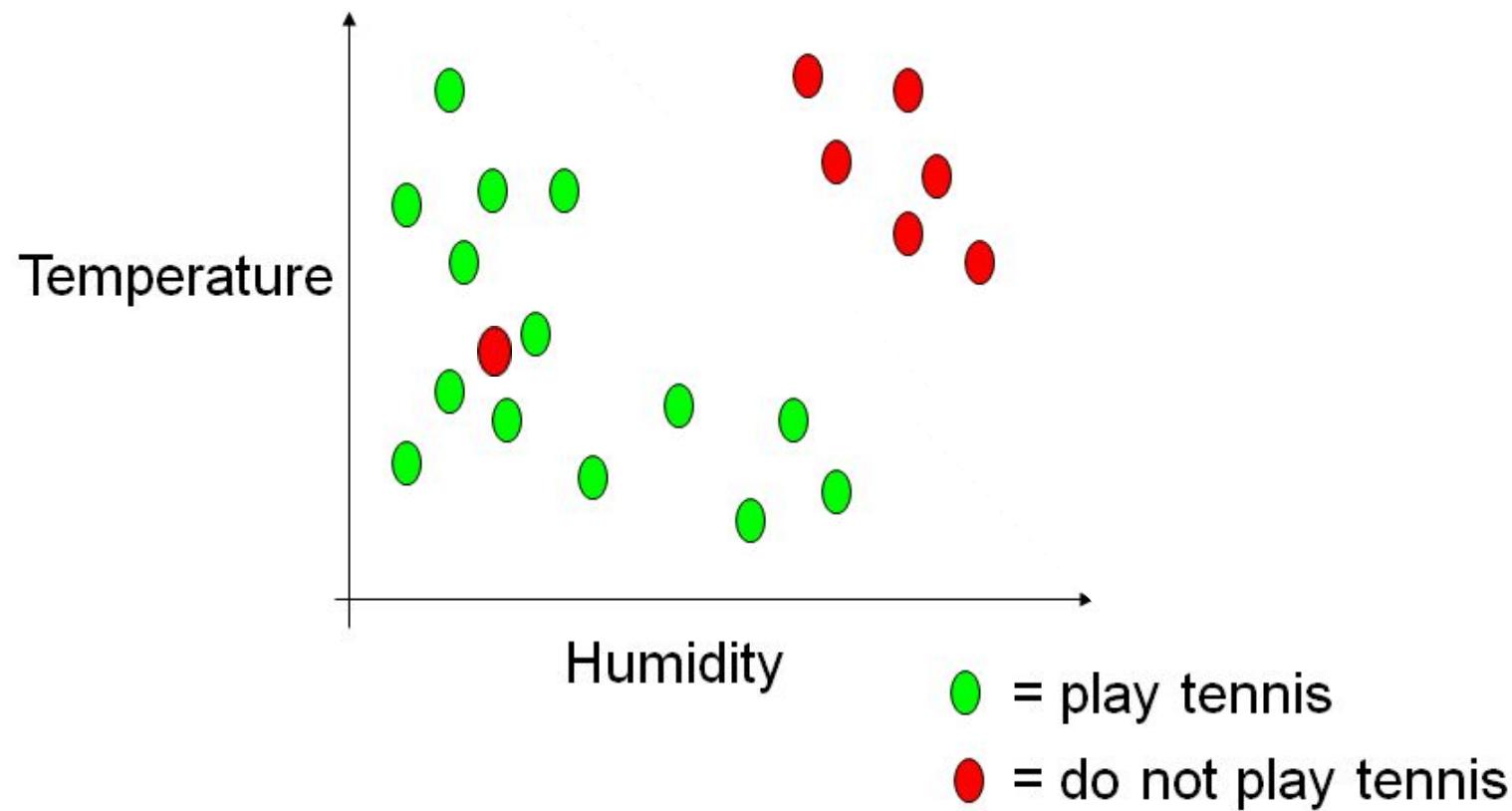
# Linearly Separable Dataset

## Tennis example



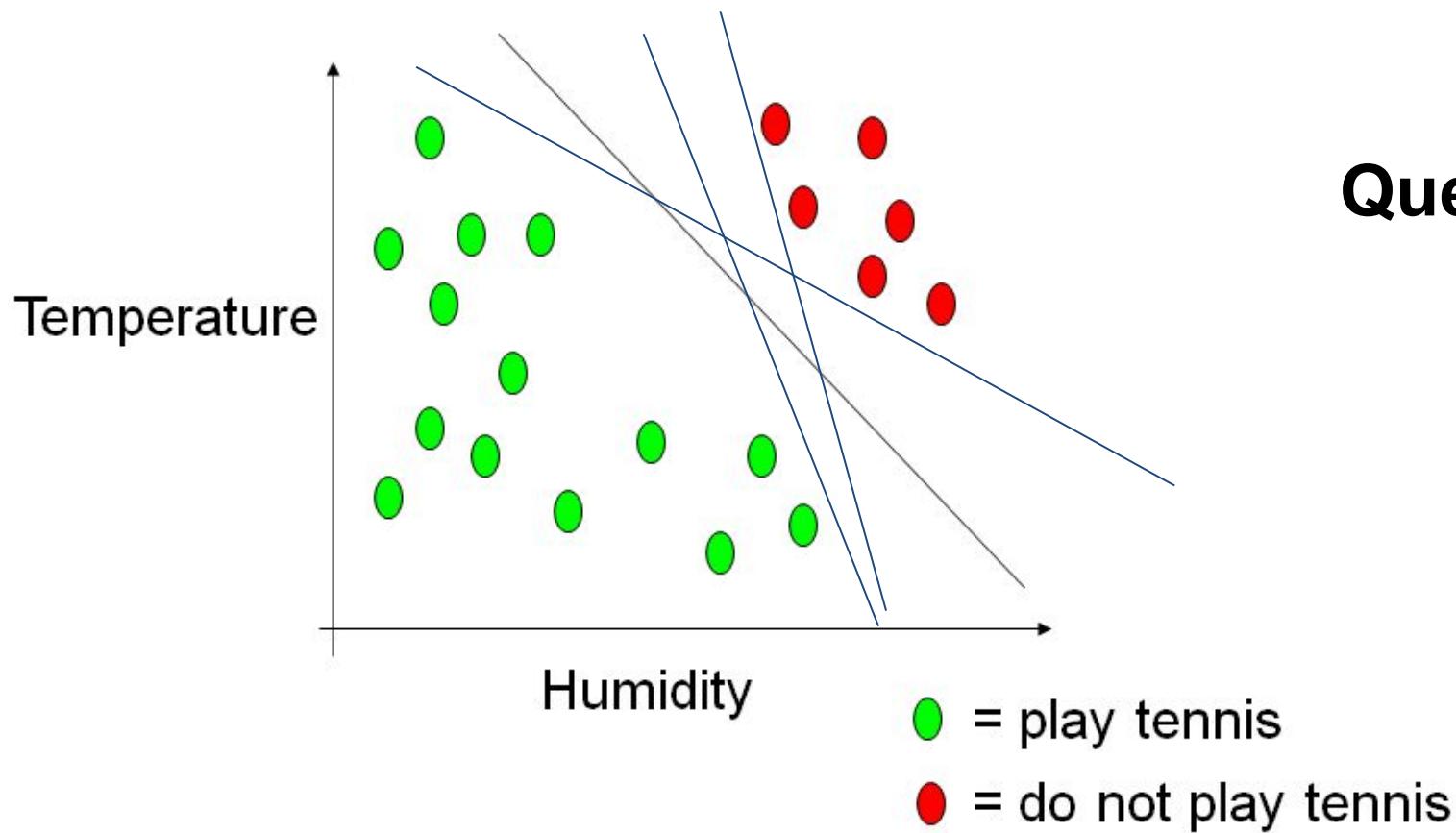
# Non-Linearly Separable Dataset

## Tennis example



# Many possible classifiers

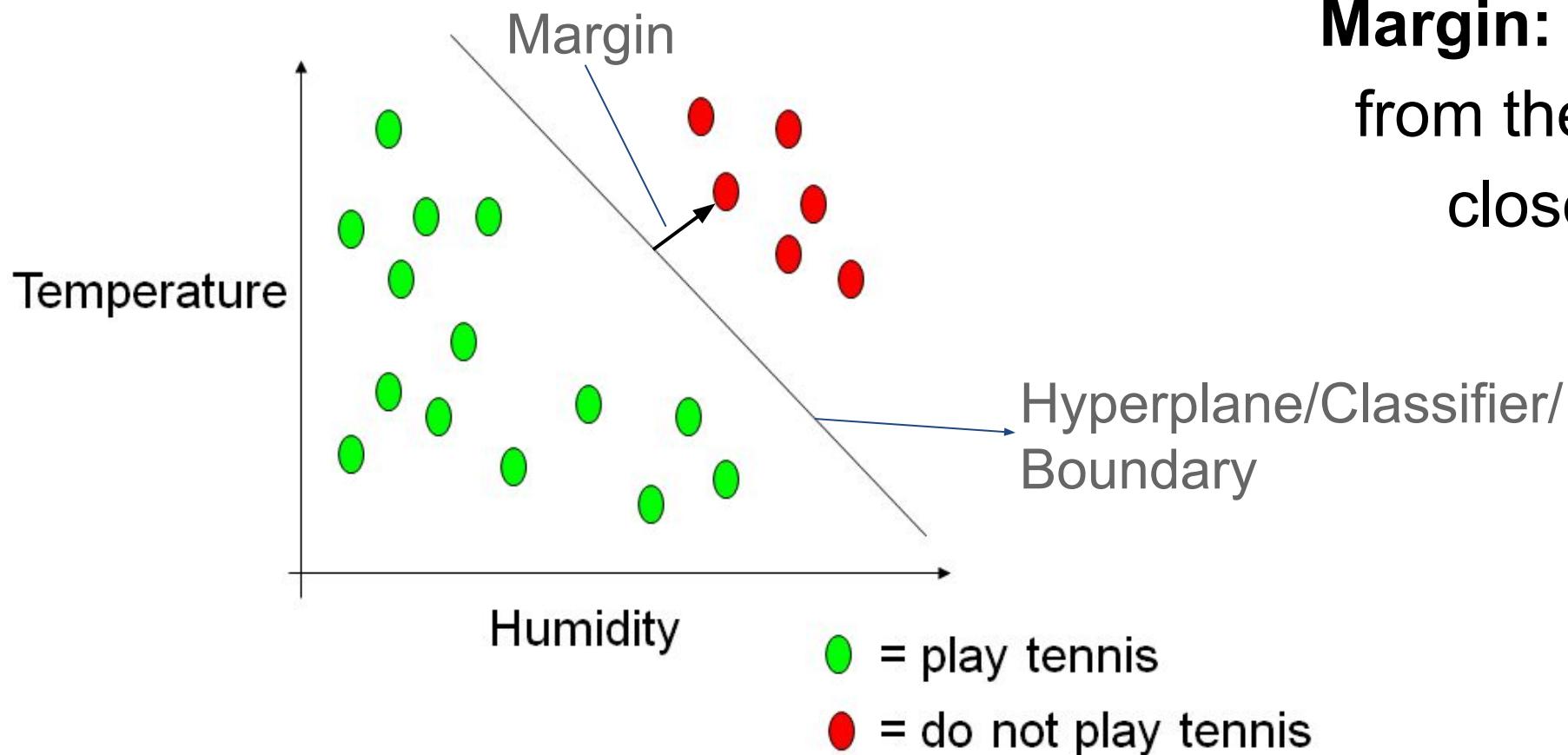
## Tennis example



**Question:** Which is the best classifier? Why?

# SVM Goal: Maximize Margin

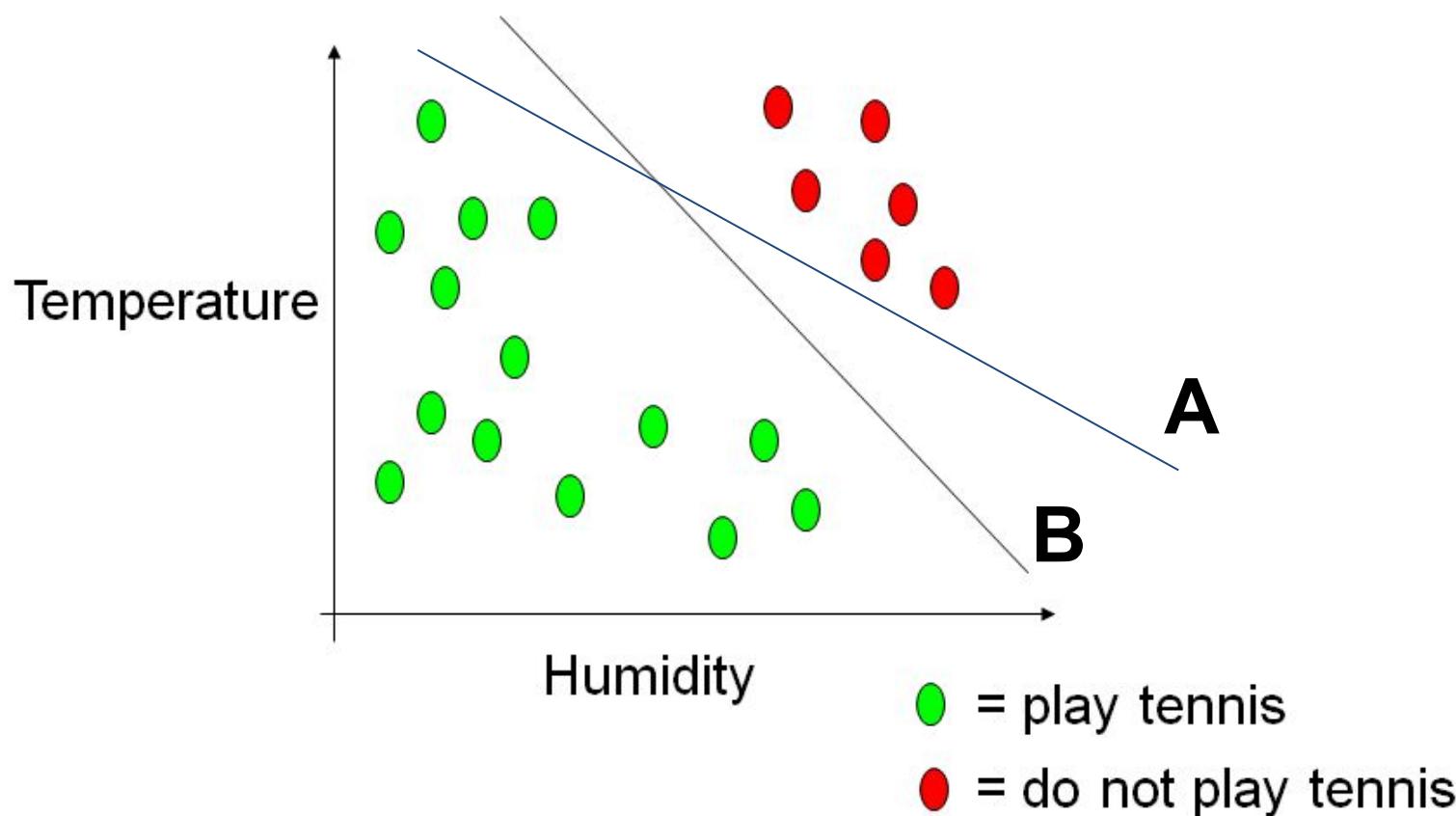
## Tennis example



**Margin:** Smallest distance from the classifier to the closest data point

# Which is a better classifier?

## Tennis example

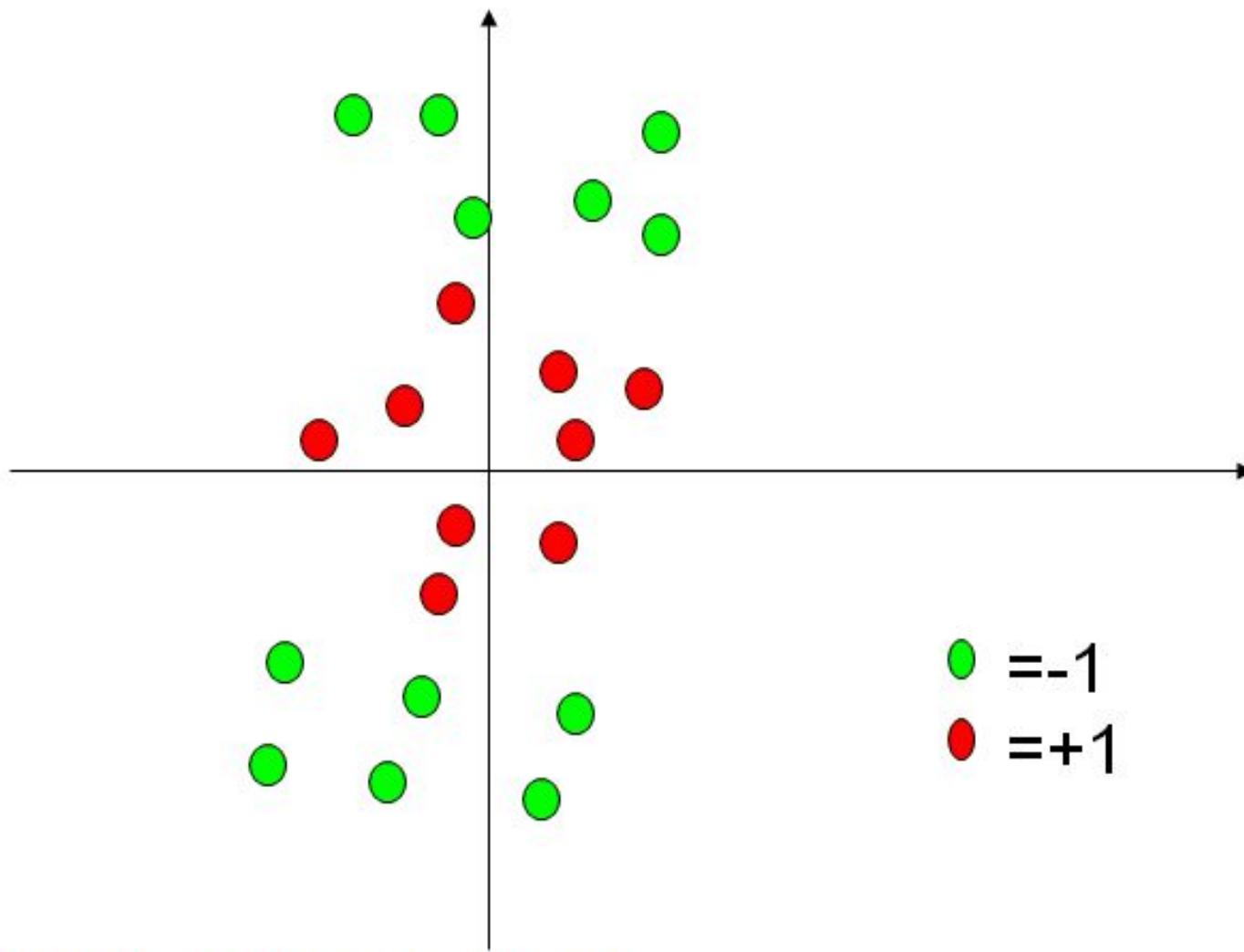


**A OR B?**

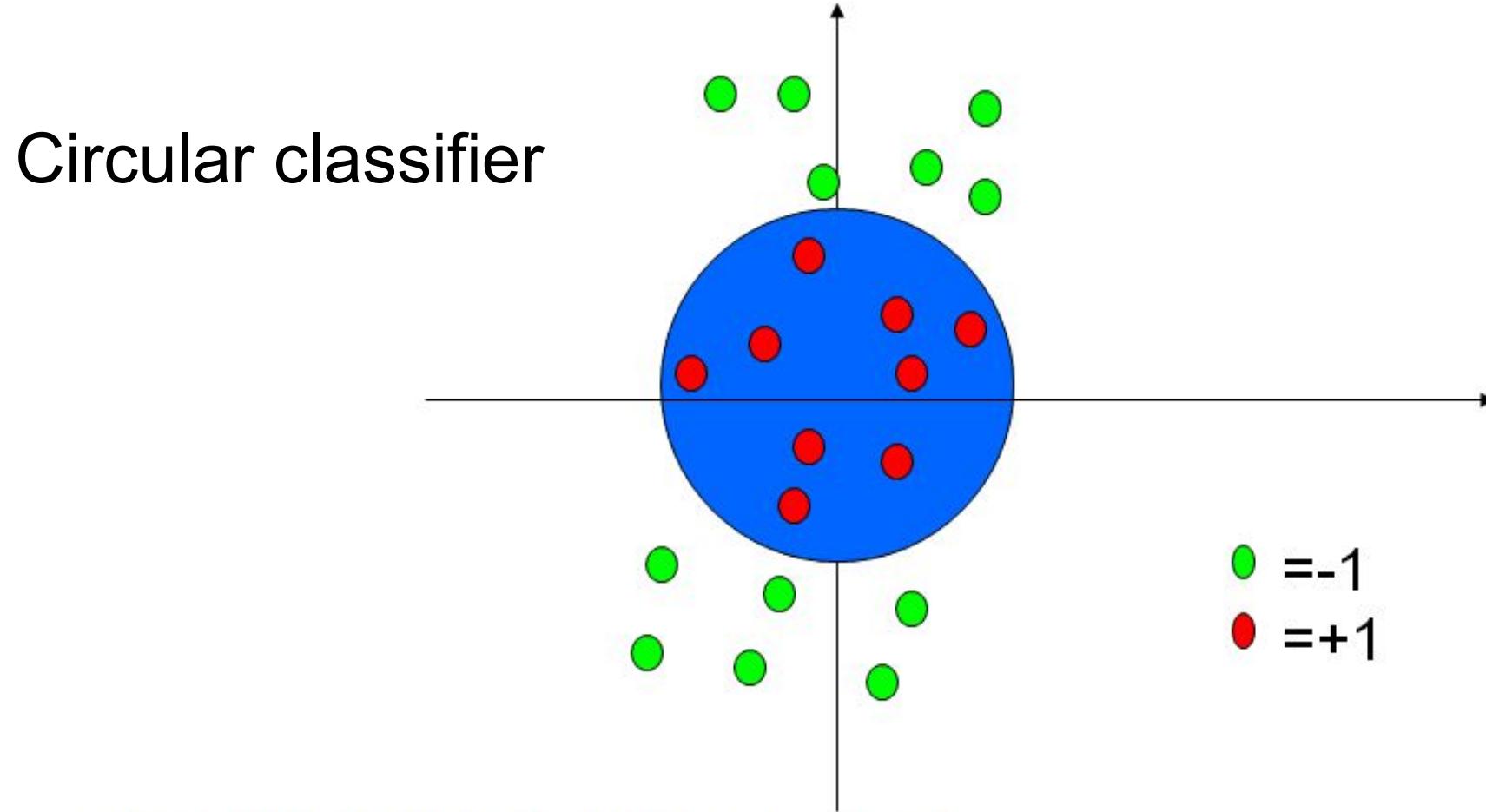
**B** because has a larger margin

**Because** has a lot of room for new data points without needing many changes

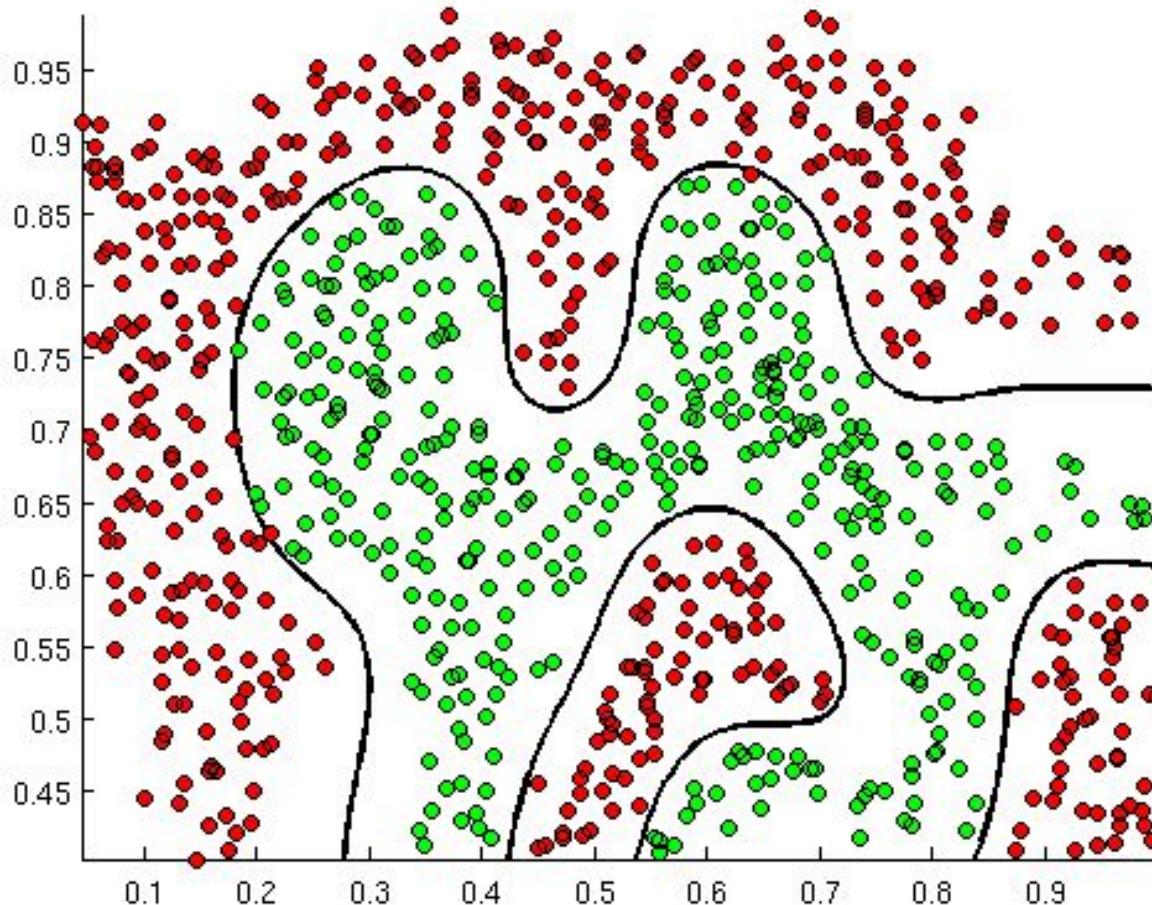
# Problem with Linear SVMs



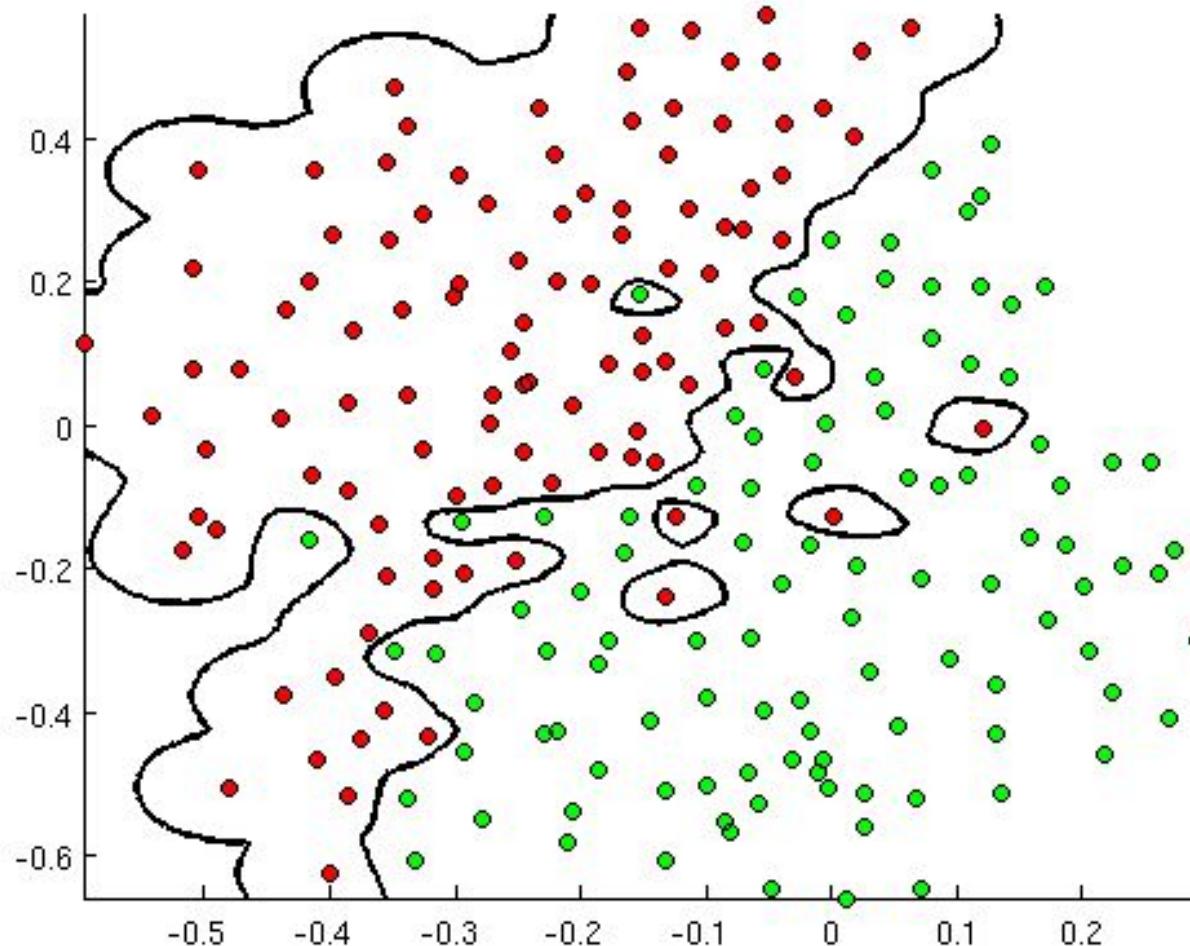
# Non-linear SVMs make them powerful



# SVMs can be irregular in shape



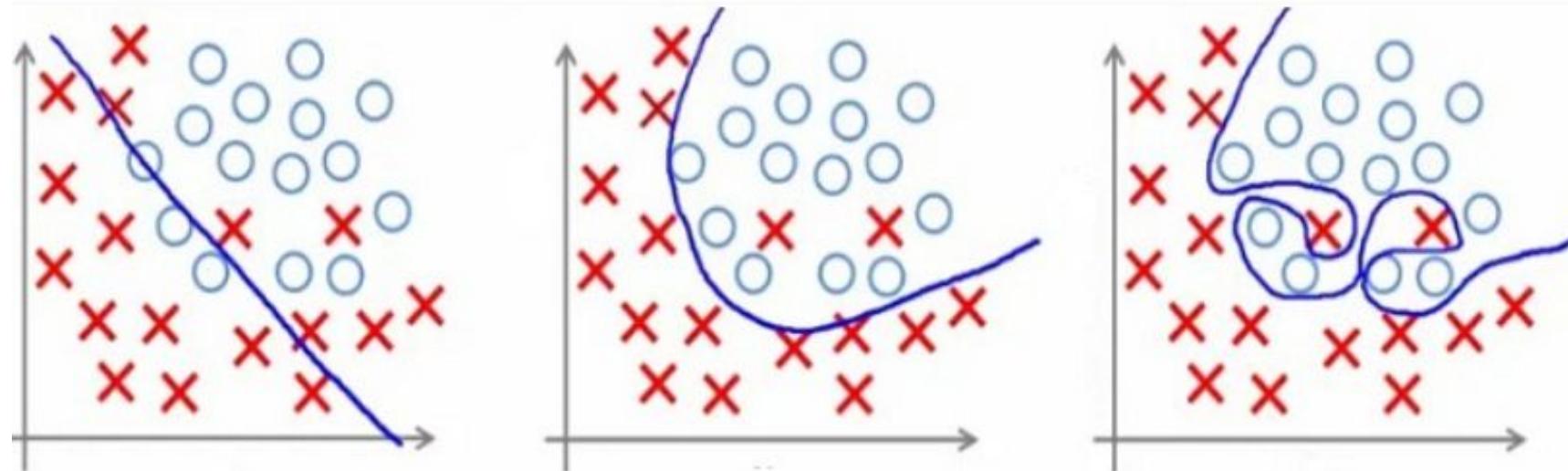
# **SVMs can have multiple disconnected boundaries**



**GOAL:** Get best possible classifier

**A lot of math involved!**

# Over & Under fitting are huge challenges for SVMs



Under-fitting

(too simple to  
explain the  
variance)

Appropriate-fitting

Over-fitting

(forcefitting -- too  
good to be true)

**GOAL:**

Be as general as possible

# **Team Project Time!**