



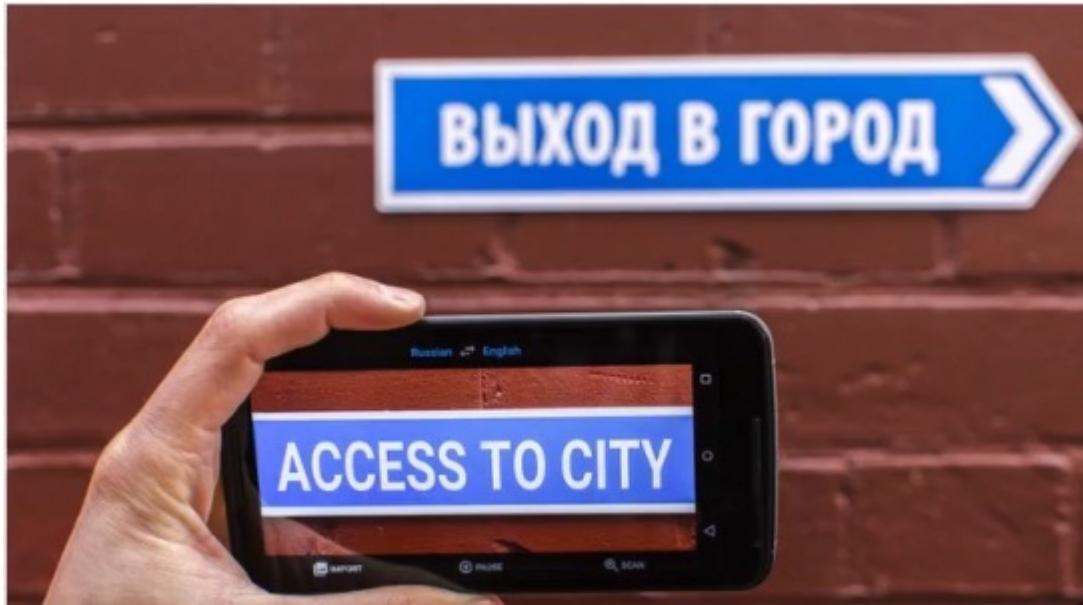
Deep Learning in Motion

Unit 1 – Module 2
Getting Started

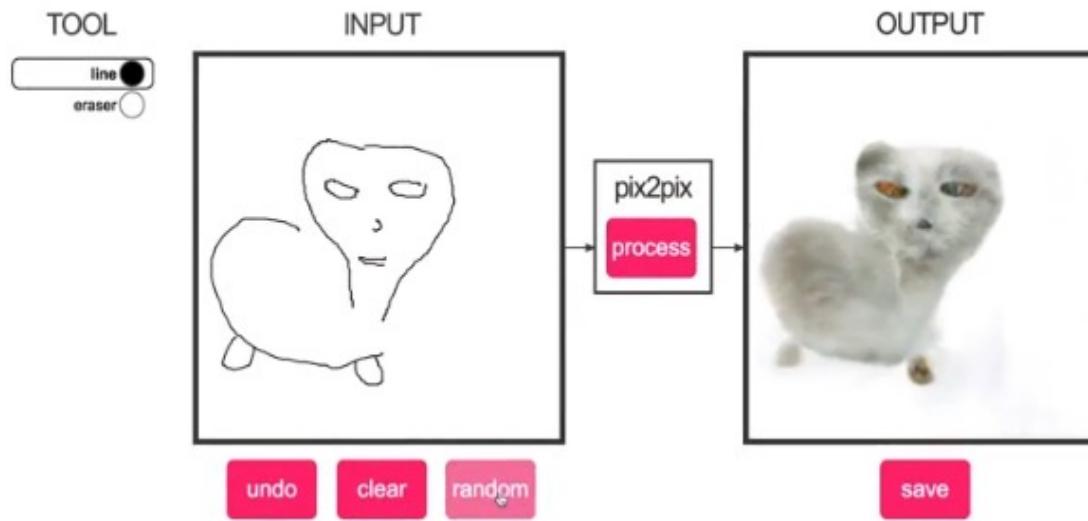
Beau Carnes



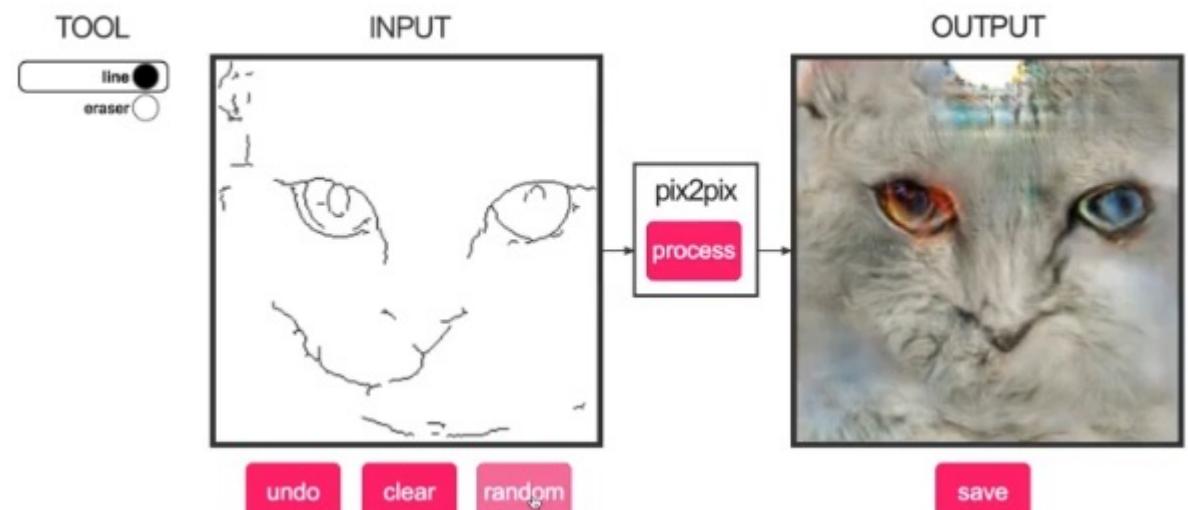
MANNING



edges2cats

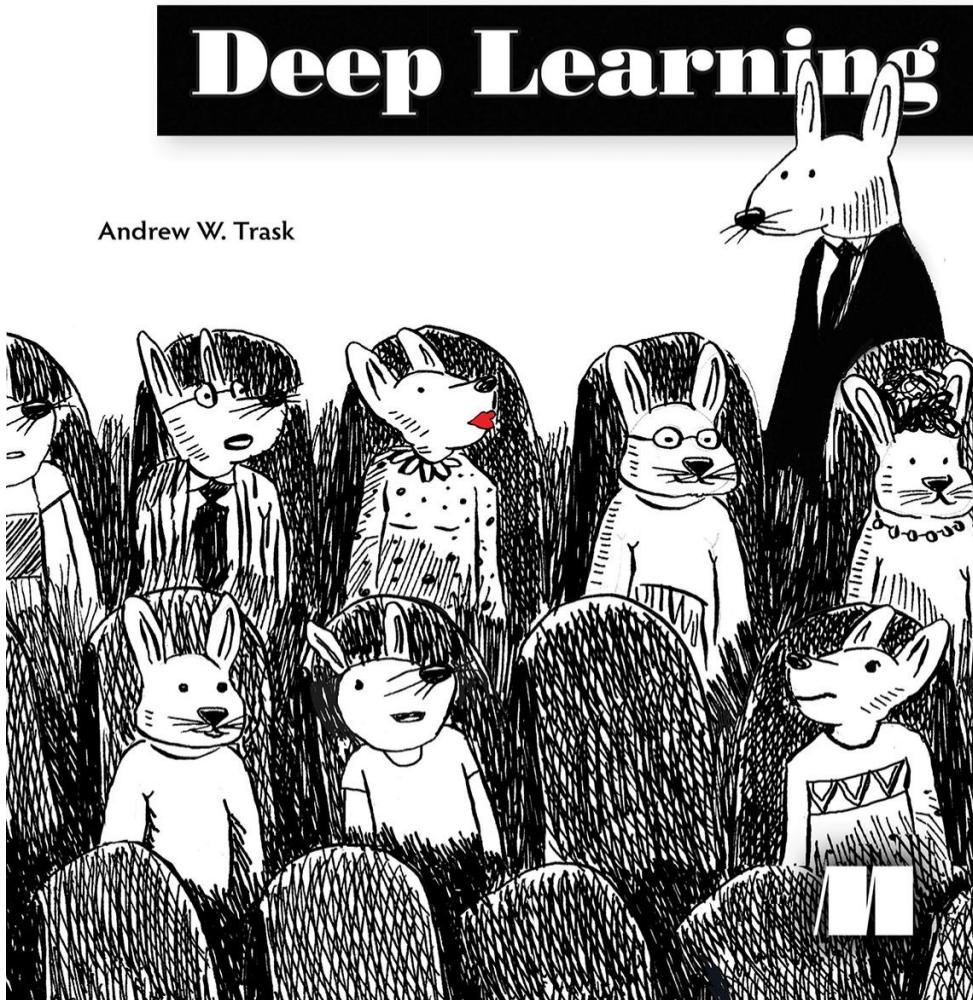


edges2cats



<https://www.youtube.com/watch?v=AmUC4m6w1wo>

grokking



Andrew W. Trask

≡ Google Scholar

ANDREW TRASK

Andrew Trask

DeepMind, University of Oxford, and OpenMined

Verified email at google.com - [Homepage](#)

Deep Learning Differential Privacy Secure Multi-Party Comput... Federated Learning Natural Language Processing

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TITLE	CITED BY	YEAR
A generic framework for privacy preserving deep learning T Ryffel, A Trask, M Dahl, B Wagner, J Mancuso, D Rueckert, ... arXiv preprint arXiv:1811.04017	121	2018
sense2vec - A Fast and Accurate Method for Word Sense Disambiguation In Neural Word Embeddings A Trask, P Michalak, J Liu arXiv preprint arXiv:1511.06388	121	2015
Neural arithmetic logic units A Trask, F Hill, S Reed, J Rae, C Dyer, P Blunsom arXiv preprint arXiv:1808.00508	105	2018
Systems and methods for neural language modeling A Trask, D Gilmore, M Russell US Patent 10,339,440	80	2019

<https://www.manning.com/books/grokking-deep-learning>

<https://github.com/iamtrask/Grokking-Deep-Learning>

<https://scholar.google.com/citations?user=2Ajxf1sAAAAJ&hl=en>

Data science technology for groundbreaking research.

Software to Install



Jupyter Notebook
www.jupyter.org



NumPy Library
www.numpy.org

<https://www.anaconda.com/>



bokeh



pandas
 $y_{it} = \beta' x_{it} + \mu_i + \epsilon_{it}$

TensorFlow



matplotlib



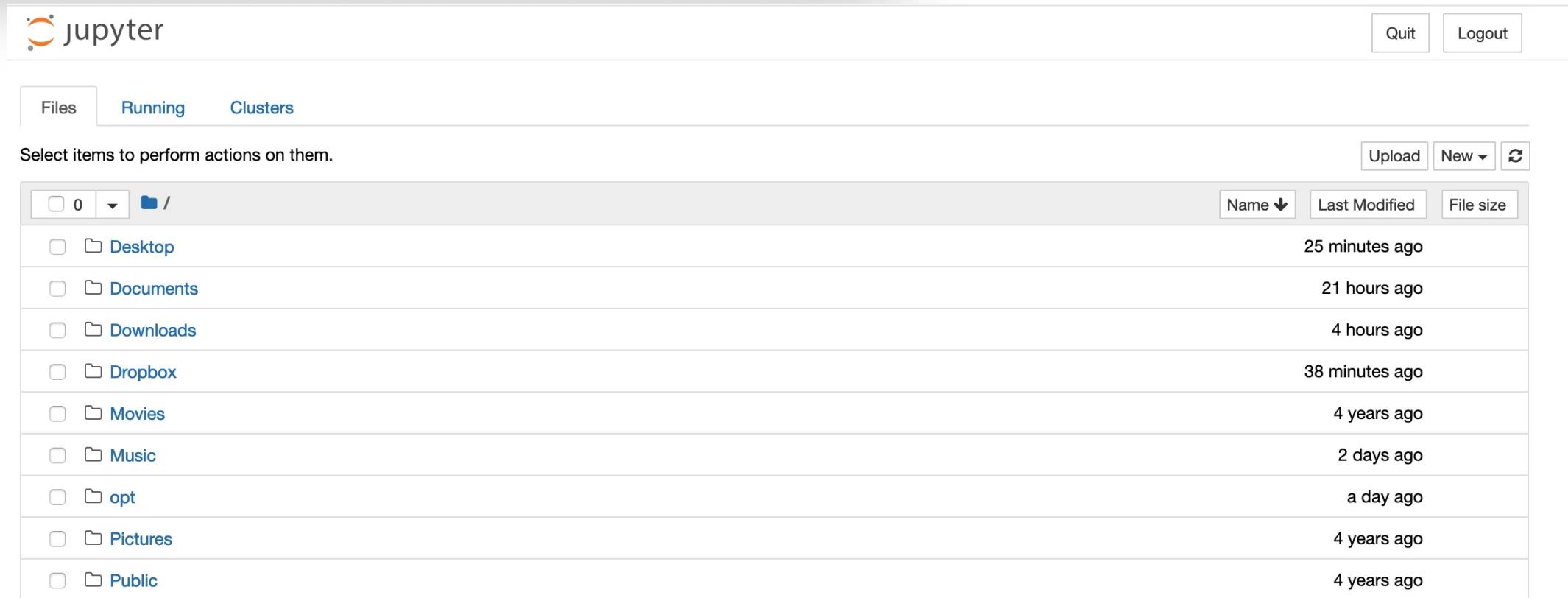
PYTORCH

CONDA®



saqibali — bash — 74x6

```
(base) Saqibs-MacBook-Pro:~ saqibali$ python --version
Python 3.8.5
(base) Saqibs-MacBook-Pro:~ saqibali$ Jupyter notebook
```



Jupyter

Files Running Clusters

Select items to perform actions on them.

Upload New ▾ ⌂

<input type="checkbox"/> 0	<input type="checkbox"/> /	Name	Last Modified	File size
<input type="checkbox"/>	<input type="checkbox"/> Desktop		25 minutes ago	
<input type="checkbox"/>	<input type="checkbox"/> Documents		21 hours ago	
<input type="checkbox"/>	<input type="checkbox"/> Downloads		4 hours ago	
<input type="checkbox"/>	<input type="checkbox"/> Dropbox		38 minutes ago	
<input type="checkbox"/>	<input type="checkbox"/> Movies		4 years ago	
<input type="checkbox"/>	<input type="checkbox"/> Music		2 days ago	
<input type="checkbox"/>	<input type="checkbox"/> opt		a day ago	
<input type="checkbox"/>	<input type="checkbox"/> Pictures		4 years ago	
<input type="checkbox"/>	<input type="checkbox"/> Public		4 years ago	

Files

Running

Clusters

Select items to perform actions on them.

Upload

New ▾



Notebook:

Python 3

Other:

Text File

Folder

Terminal

<input type="checkbox"/>	Name	
<input type="checkbox"/>	0	
<input type="checkbox"/>	Desktop	
<input type="checkbox"/>	Documents	
<input type="checkbox"/>	Downloads	
<input type="checkbox"/>	Dropbox	
<input type="checkbox"/>	Movies	4 years ago
<input type="checkbox"/>	Music	2 days ago
<input type="checkbox"/>	opt	a day ago
<input type="checkbox"/>	Pictures	4 years ago
<input type="checkbox"/>	Public	4 years ago

The screenshot shows a Jupyter Notebook interface. At the top, there's a header bar with the logo, the title "jupyter test Last Checkpoint: 10 minutes ago (autosaved)", a Python 2 icon, and a "Logout" button. Below the header is a menu bar with File, Edit, View, Insert, Cell, Kernel, Widgets, and Help. To the right of the menu are buttons for Trusted and Python 2. The main area contains three code cells:

- In [1]: `place = "world"`
- In [3]: `print("hello " + place)`
Output: `hello world`
- In []: (empty cell)

The second cell is currently active, indicated by a blue border around its input line.

One of the most important parts of learning deep learning is the ability to stop a network while it's training and tear apart absolutely every piece to see what it looks like. This is something Jupyter Notebook is incredibly useful for.

What are Lists?

- Lists are used to store multiple items in a single variable.
- Lists are one of 4 built-in data types in Python used to store collections of data, the other 3 are [Tuple](#), [Set](#), and [Dictionary](#), all with different qualities and usage.
- Lists are created using square brackets:
- For Example:

```
thislist = ["apple", "banana", "cherry"]
print(thislist)
```

List Items

- List items are ordered, changeable, and allow duplicate values.
- List items are indexed, the first item has index [0], the second item has index [1] etc.

Ordered

- When we say that lists are ordered, it means that the items have a defined order, and that order will not change.
- If you add new items to a list, the new items will be placed at the end of the list.

Changeable

- The list is changeable, meaning that we can change, add, and remove items in a list after it has been created.

Allow Duplicates

- Since lists are indexed, lists can have items with the same value.
- **For Example** - Lists allow duplicate values:

```
thislist = ["apple", "banana", "cherry", "apple", "cherry"]  
print(thislist)
```

List Length

- To determine how many items a list has, use the len() function.
- For Example - Print the number of items in the list.

```
thislist = ["apple", "banana", "cherry"]
print(len(thislist))
```

List Items - Data Types

- List items can be of any data type.
- **For Example** - String, int and boolean data types.

```
list1 = ["apple", "banana", "cherry"]
```

```
list2 = [1, 5, 7, 9, 3]
```

```
list3 = [True, False, False]
```

A list with strings, integers and boolean values:

```
list1 = ["abc", 34, True, 40, "male"]
```

ObjectType

- **type()**
- From Python's perspective, lists are defined as objects with the data type 'list'.

```
<class 'list'>
```

What is the data type of a list?

```
mylist = ["apple", "banana", "cherry"]  
print(type(mylist))
```

The list() Constructor

- It is also possible to use the list() constructor when creating a new list.
- **For Example -** Using the list() constructor to make a List:

```
thislist = list(("apple", "banana", "cherry")) # note the double  
round-brackets  
print(thislist)
```

2. Tuples

- Tuples are used to store multiple items in a single variable.
- A tuple is a collection which is ordered and **unchangeable**.
- Tuples are written with round brackets.

```
thistuple = ("apple", "banana", "cherry")
print(thistuple)
```

Tuple Items

- Tuple items are ordered, unchangeable, and allow duplicate values.
- Tuple items are indexed, the first item has index [0], the second item has index [1] etc.

Tuple Items

Tuple items are ordered, unchangeable, and allow duplicate values.

Ordered

When we say that tuples are ordered, it means that the items have a defined order, and that order will not change. Tuple items are indexed, the first item has index [0], the second item has index [1] etc.

Unchangeable

Tuples are unchangeable, meaning that we cannot change, add or remove items after the tuple has been created.

Allow Duplicates

Since tuples are indexed, tuples can have items with the same value:

```
thistuple = ("apple", "banana", "cherry", "apple", "cherry")
print(thistuple)
```

Tuple With One Item

To create a tuple with only one item, you have to add a comma after the item, otherwise Python will not recognize it as a tuple.

```
thistuple = ("apple",)  
print(type(thistuple))
```

#NOT a tuple
thistuple = ("apple")
print(type(thistuple))

Tuple Items - Data Types

- Tuple items can be of any data type:

String, int and boolean data types:

```
tuple1 = ("apple", "banana", "cherry")  
tuple2 = (1, 5, 7, 9, 3)  
tuple3 = (True, False, False)
```

- A tuple can contain different data types:

A tuple can contain different data types:

A tuple with strings, integers and boolean values:

```
tuple1 = ("abc", 34, True, 40, "male")
```

type()

- From Python's perspective, tuples are defined as objects with the data type 'tuple':

What is the data type of a tuple?

```
mytuple = ("apple", "banana", "cherry")
print(type(mytuple))
```

The tuple() Constructor

It is also possible to use the tuple() constructor to make a tuple.

Using the tuple() method to make a tuple:

```
thistuple = tuple(("apple", "banana", "cherry")) # note the double round-brackets  
print(thistuple)
```

3. Sets

- Sets are used to store multiple items in a single variable.
- A set is a collection which is both *unordered* and *unindexed*.
- Sets are written with curly brackets.

Example

Create a Set:

```
thisset = {"apple", "banana", "cherry"}  
print(thisset)
```

Set Items

Set items are unordered, unchangeable, and do not allow duplicate values.

Unordered

- Unordered means that the items in a set do not have a defined order.
- Set items can appear in a different order every time you use them, and cannot be referred to by index or key.

Unchangeable

- Sets are unchangeable, meaning that we cannot change the items after the set has been created.
- Once a set is created, you cannot change its items, but you can add new items.
- **Duplicates Not Allowed**
- Sets cannot have two items with the same value. Duplicate values will be ignored:

```
thisset = {"apple", "banana", "cherry", "apple"}  
print(thisset)
```

Length of a Set

- To determine how many items a set has, use the `len()` method.

Get the number of items in a set:

```
thisset = {"apple", "banana", "cherry"}
```

```
print(len(thisset))
```

Set Items - Data Types

- Set items can be of any data type:

String, int and boolean data types:

```
set1 = {"apple", "banana", "cherry"}
```

```
set2 = {1, 5, 7, 9, 3}
```

```
set3 = {True, False, False}
```

- A set can contain different data types:

A set with strings, integers and boolean values:

```
set1 = {"abc", 34, True, 40, "male"}
```

type()

- From Python's perspective, sets are defined as objects with the data type 'set':

What is the data type of a set?

```
myset = {"apple", "banana", "cherry"}  
print(type(myset))
```

The set() Constructor

- It is also possible to use the set() constructor to make a set.

Using the set() constructor to make a set:

```
thisset = set(("apple", "banana", "cherry")) # note the double round-brackets  
print(thisset)
```

4. Dictionaries

- Dictionaries are used to store data values in key:value pairs.
- A dictionary is a collection which is ordered, changeable and does not allow duplicates.
- As of Python version 3.7, dictionaries are *ordered*. In Python 3.6 and earlier, dictionaries are *unordered*.
- Dictionaries are written with curly brackets, and have keys and values:

Create and print a dictionary:

```
thisdict = {  
    "brand": "Ford",  
    "model": "Mustang",  
    "year": 1964  
}  
print(thisdict)
```

Dictionary Items

- Dictionary items are ordered, changeable, and does not allow duplicates.
- Dictionary items are presented in key:value pairs, and can be referred to by using the key name.

Print the "brand" value of the dictionary:

```
thisdict = {  
    "brand": "Ford",  
    "model": "Mustang",  
    "year": 1964  
}  
print(thisdict["brand"])
```

Ordered or Unordered?

- As of Python version 3.7, dictionaries are *ordered*. In Python 3.6 and earlier, dictionaries are *unordered*.
- When we say that dictionaries are ordered, it means that the items have a defined order, and that order will not change.
- Unordered means that the items does not have a defined order, you cannot refer to an item by using an index.

Changeable

Dictionaries are changeable, meaning that we can change, add or remove items after the dictionary has been created.

Duplicates Not Allowed

Dictionaries cannot have two items with the same key:

Duplicate Values

Duplicate values will overwrite existing values:

```
thisdict = {  
    "brand": "Ford",  
    "model": "Mustang",  
    "year": 1964,  
    "year": 2020  
}  
print(thisdict)
```

Dictionary Length

- To determine how many items a dictionary has, use the `len()` function:

Print the number of items in the dictionary:

```
print(len(thisdict))
```

Dictionary Items - Data Types

- The values in dictionary items can be of any data type:

String, int, boolean, and list data types:

```
thisdict = {  
    "brand": "Ford",  
    "electric": False,  
    "year": 1964,  
    "colors": ["red", "white", "blue"]  
}
```

type()

- From Python's perspective, dictionaries are defined as objects with the data type 'dict':

Print the data type of a dictionary:

```
thisdict = {  
    "brand": "Ford",  
    "model": "Mustang",  
    "year": 1964  
}  
print(type(thisdict))
```

Tuple Items

- Tuple items are ordered, unchangeable, and allow duplicate values.
- Tuple items are indexed, the first item has index [0], the second item has index [1] etc.

Tuple Items

- Tuple items are ordered, unchangeable, and allow duplicate values.
- Tuple items are indexed, the first item has index [0], the second item has index [1] etc.

List	Tuples	Dictionary
A list is mutable	A tuple is immutable	A dictionary is mutable
Lists are dynamic	Tuples are fixed size in nature	In values can be of any data type and can repeat, keys must be of immutable type
List are enclosed in brackets[] and their elements and size can be changed	Tuples are enclosed in parenthesis () and cannot be updated	Tuples are enclosed in curly braces { } and consist of key:value
Homogenous	Heterogeneous	Homogenous
Example: List = [10, 12, 15]	Example: Words = ("spam", "eggs") Or Words = "spam", "eggs"	Example: Dict = {"ram": 26, "abi": 24}
<u>Access:</u> print(list[0])	<u>Access:</u> print(words[0])	<u>Access:</u> print(dict["ram"])
Can contain duplicate elements	Can contain duplicate elements. Faster compared to lists	Can't contain duplicate keys, but can contain duplicate values
Slicing can be done	Slicing can be done	Slicing can't be done
<u>Usage:</u> ❖ List is used if a collection of data that doesn't need random access. ❖ List is used when data can be modified frequently	<u>Usage:</u> ❖ Tuple can be used when data cannot be changed. ❖ A tuple is used in combination with a dictionary i.e. a tuple might represent a key.	<u>Usage:</u> ❖ Dictionary is used when a logical association between key:value pair. ❖ When in need of fast lookup for data, based on a custom key. ❖ Dictionary is used when data is being constantly modified.

NumPy Introduction

- NumPy is a Python library used for working with arrays.
- It also has functions for working in domain of linear algebra, fourier transform, and matrices.
- NumPy was created in 2005 by Travis Oliphant. It is an open source project and you can use it freely.
- NumPy stands for Numerical Python.

Why Use NumPy?

- In Python we have **lists** that serve the purpose of arrays, but they are **slow to process**.
- NumPy aims to provide an array object that is up to 50x faster than traditional Python lists.
- The array object in NumPy is called ndarray, it provides a lot of supporting functions that make working with ndarray very easy.
- Arrays are very frequently used in data science, where speed and resources are very important.

Why is NumPy Faster Than Lists?

- NumPy arrays are stored at **one continuous place in memory** unlike lists, so processes can access and manipulate them very efficiently.
- This behaviour is called locality of reference in computer science.
- This is the main reason why NumPy is faster than lists. Also it is optimized to work with latest CPU architectures.

Which Language is NumPy written in?

- NumPy is a Python library and is written partially in Python, but most of the parts that require fast computation are written in C or C++.

Create a NumPy ndarray Object

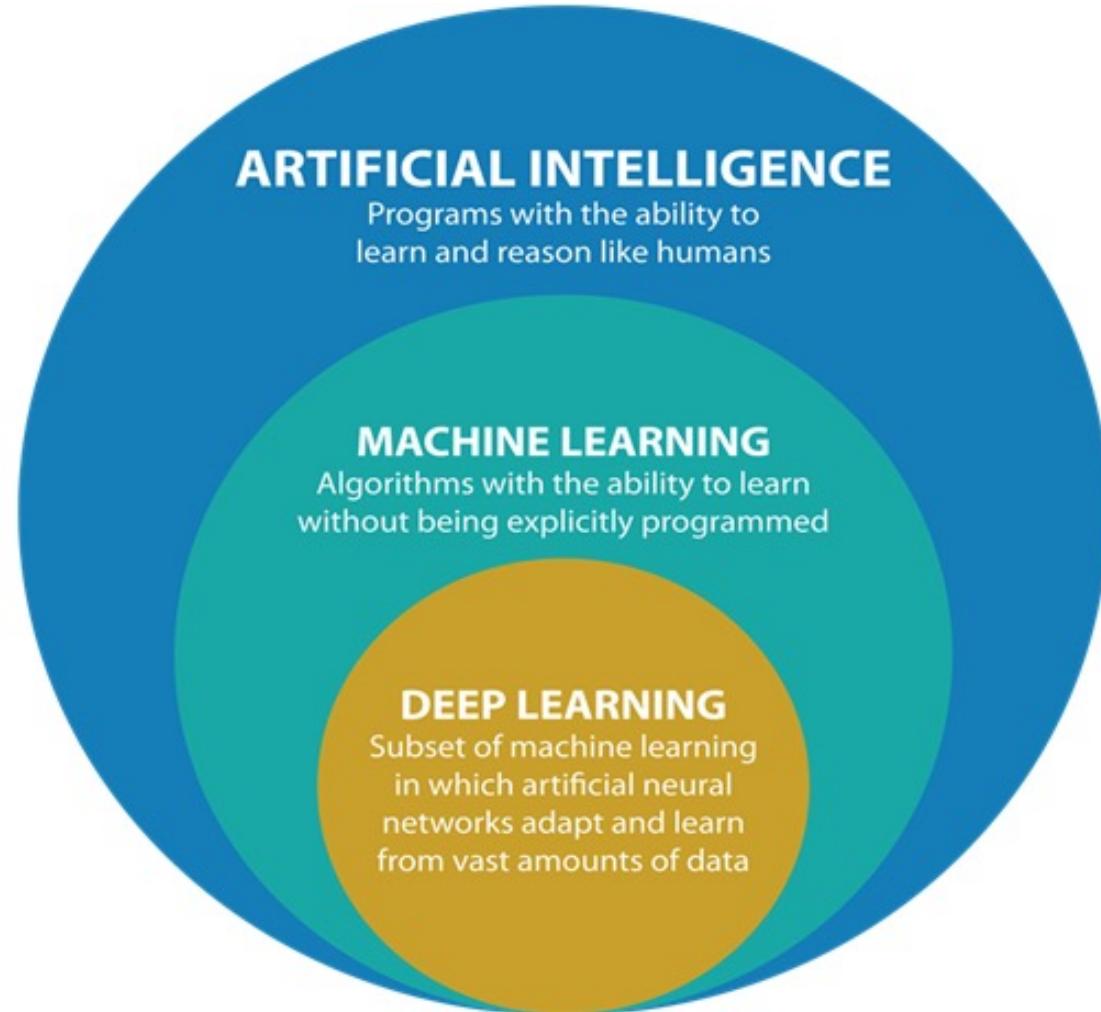
- NumPy is used to work with arrays. The array object in NumPy is called ndarray.
- We can create a NumPy ndarray object by using the **array()** function.
- For Example.

```
import numpy as np  
arr = np.array([1, 2, 3, 4, 5])  
print(arr)  
print(type(arr))
```

To create an ndarray, we can pass a list, tuple or any array-like object into the array() method, and it will be converted into an ndarray:

```
import numpy as np  
arr = np.array((1, 2, 3, 4, 5))  
print(arr)
```

What is Deep Learning?



What is Machine Learning?

Machine learning is a subfield of computer science wherein *machines learn* to perform tasks for which they were *not explicitly programmed*. In short, machines observe a pattern and attempt to imitate it in some way that can be either direct or indirect.

Machine learning \approx Monkey see, monkey do

Types of Machine Learning?

1. Supervised Learning learning is the direct imitation of a pattern between two datasets. It's always attempting to take an input dataset and transform it into an output dataset. For example.

- Using the **pixels** of an image to detect the *presence or absence of a cat*
- Using the **movies you've liked** to predict more *movies you may like*
- Using someone's **words** to predict whether they're *happy or sad*
- Using weather sensor **data** to predict the *probability of rain*
- Using car engine **sensors** to predict the optimal tuning *settings*
- Using news **data** to predict tomorrow's stock *price*
- Using an input **number** to predict a *number double its size*
- Using a raw **audio file** to predict a *transcript* of the audio

Supervised Learning

Supervised learning transforms datasets

Supervised machine learning is the direct imitation of a pattern between two datasets. It's always attempting to take an input dataset and transform it into an output dataset.



It's useful for taking *what you know* as input and quickly transforming it into *what you want to know*. The majority of work using machine learning results in the training of a supervised classifier of some kind.

Summary of Machine Learning

(Determining if an image contains a cat)

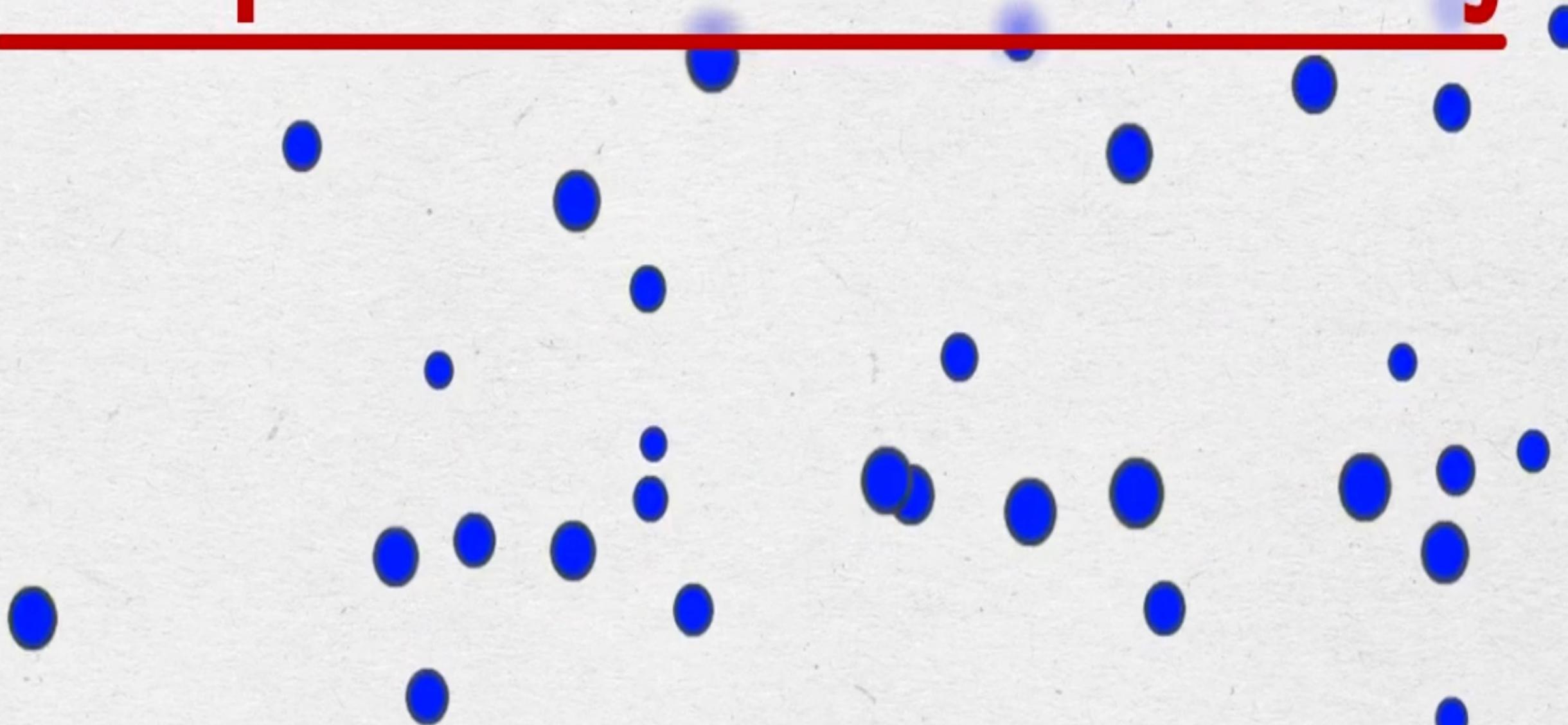
1. Feed the algorithm thousands of pictures - some with cats, some without
2. Tell the algorithm which pictures have cats and which do not
3. Algorithm extracts patterns from the data
4. Algorithm can hopefully correctly identify which pictures have cats

Unsupervised Learning

Unsupervised learning groups your data.

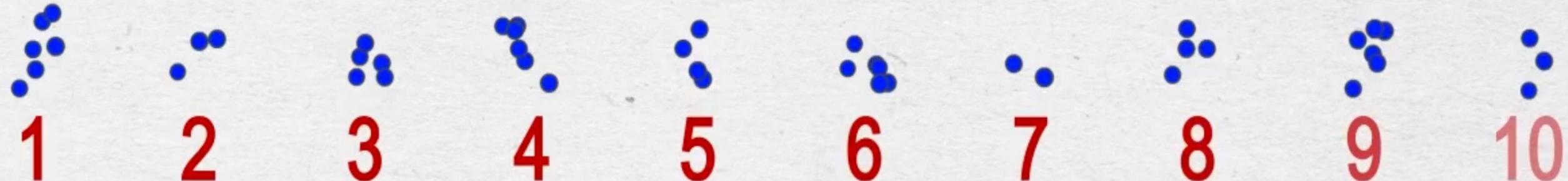
Unsupervised learning shares a property in common with supervised learning: it transforms one dataset into another. But the dataset that it transforms into *is not previously known or understood*. Unlike supervised learning, there is no “right answer” that you’re trying to get the model to duplicate. You just tell an unsupervised algorithm to “find patterns in this data and tell me about them.”

Unsupervised Machine Learning



Unsupervised Machine Learning

Clusters

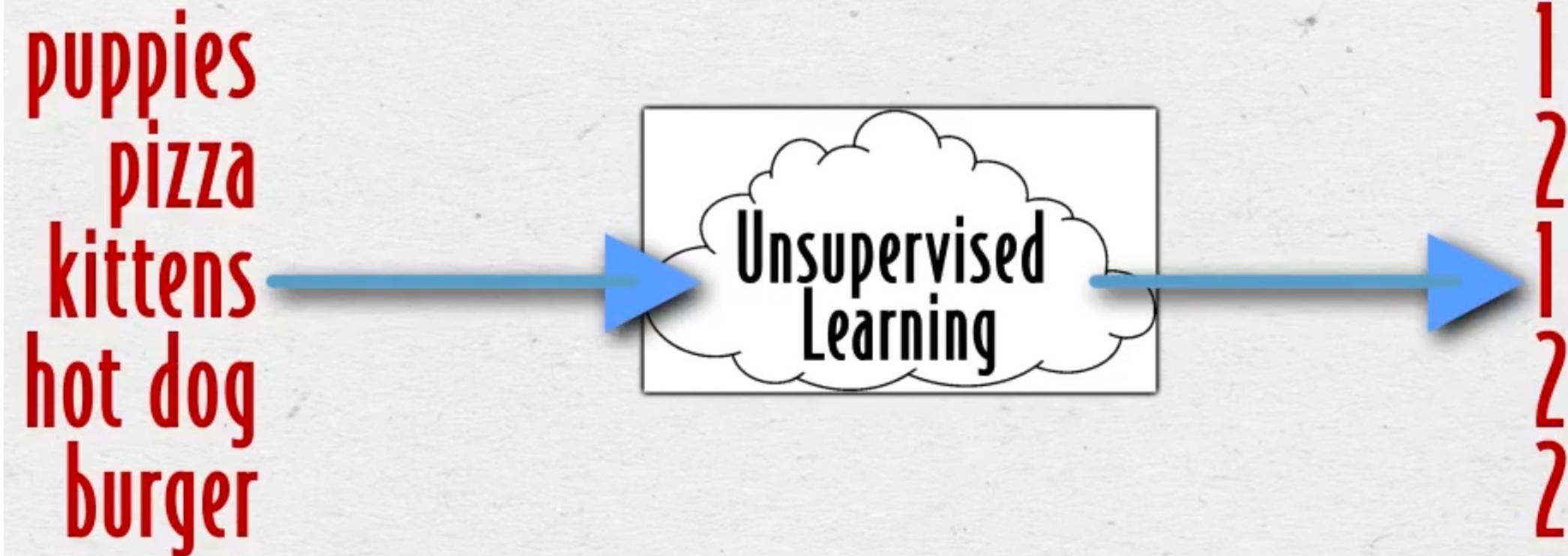


Unsupervised Machine Learning



Unsupervised Learning

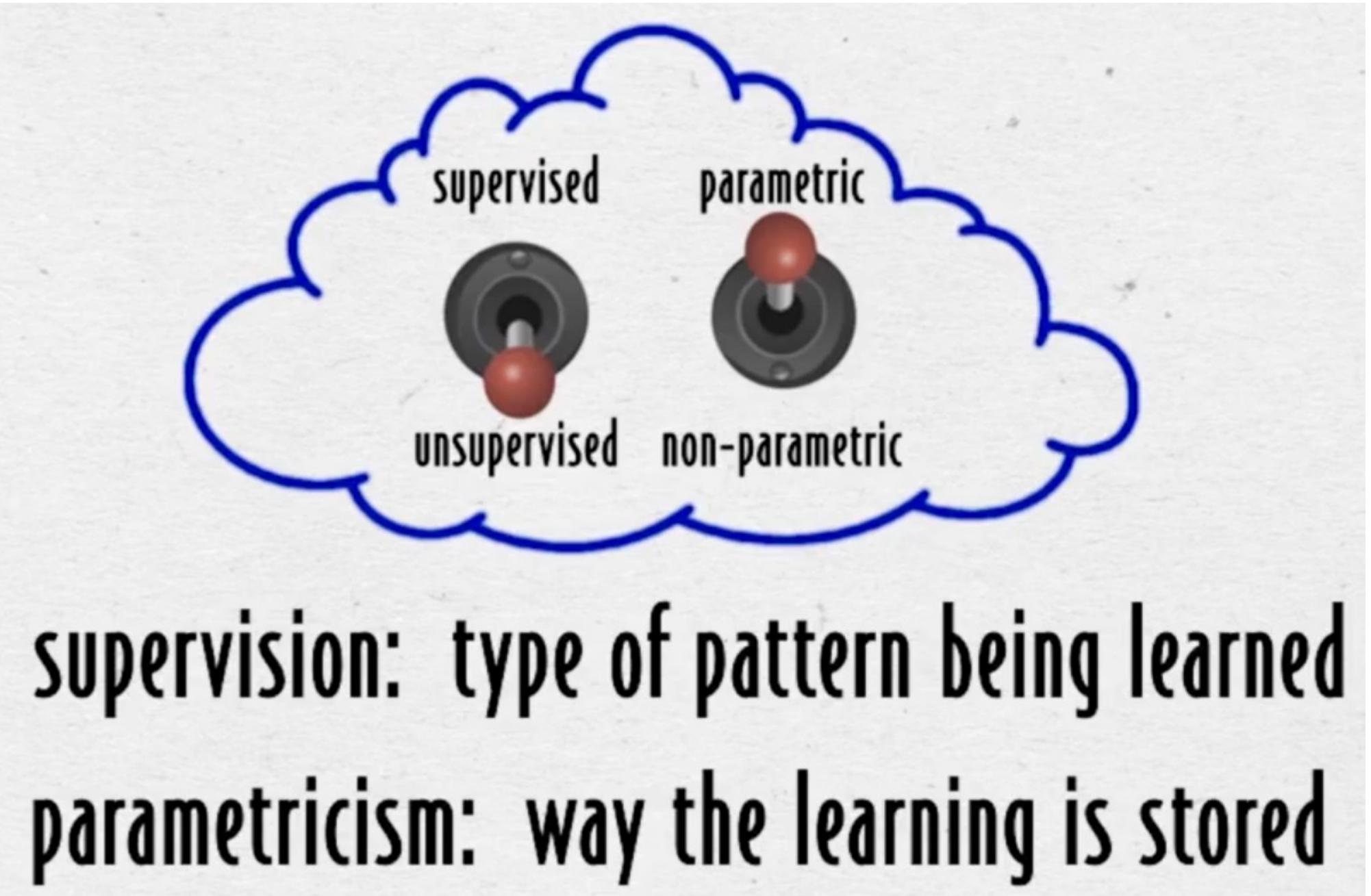
For example, clustering a dataset into groups is a type of unsupervised learning. Clustering transforms a sequence of datapoints into a sequence of cluster labels. If it learns 10 clusters, it's common for these labels to be the numbers 1–10.

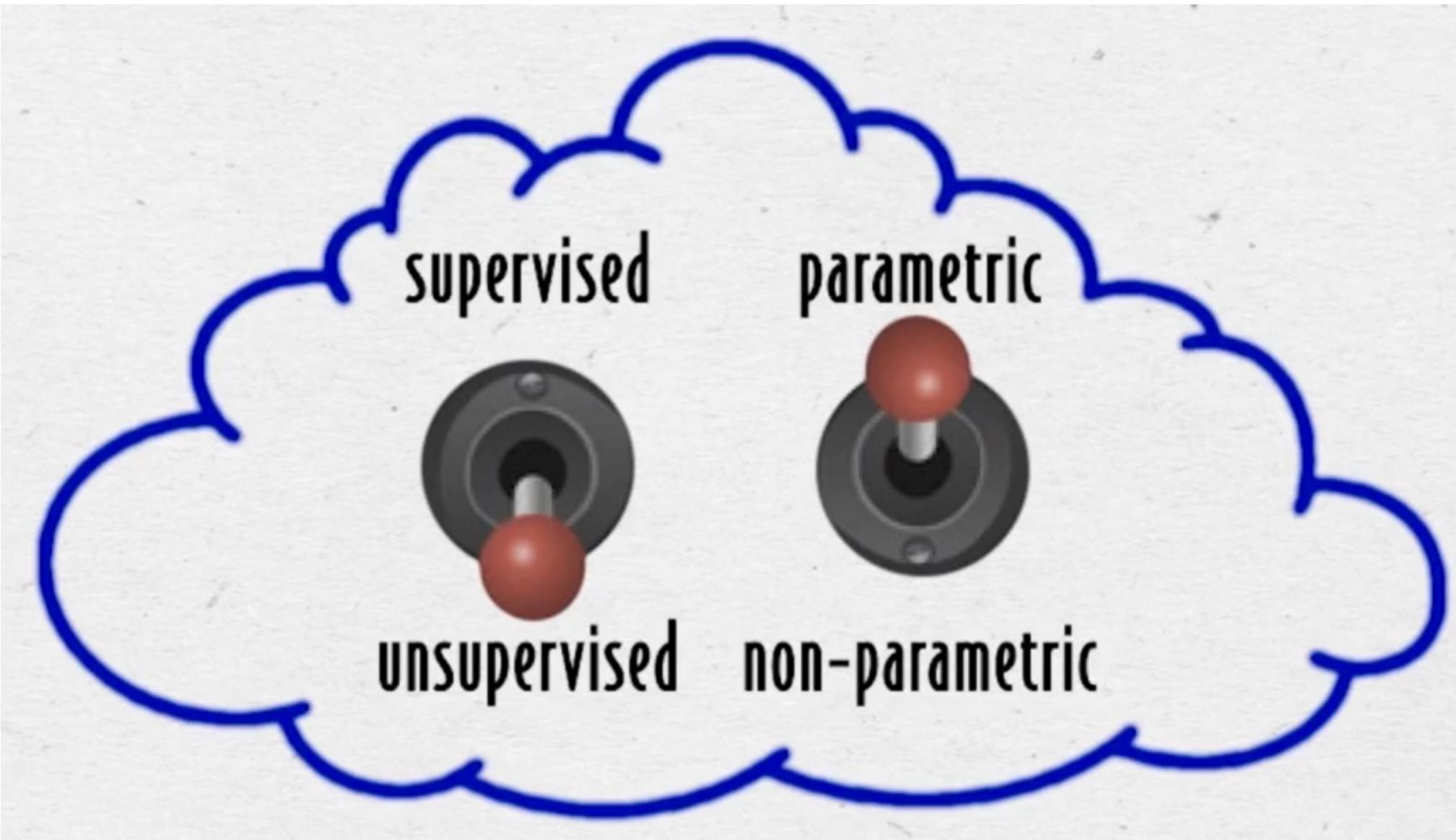


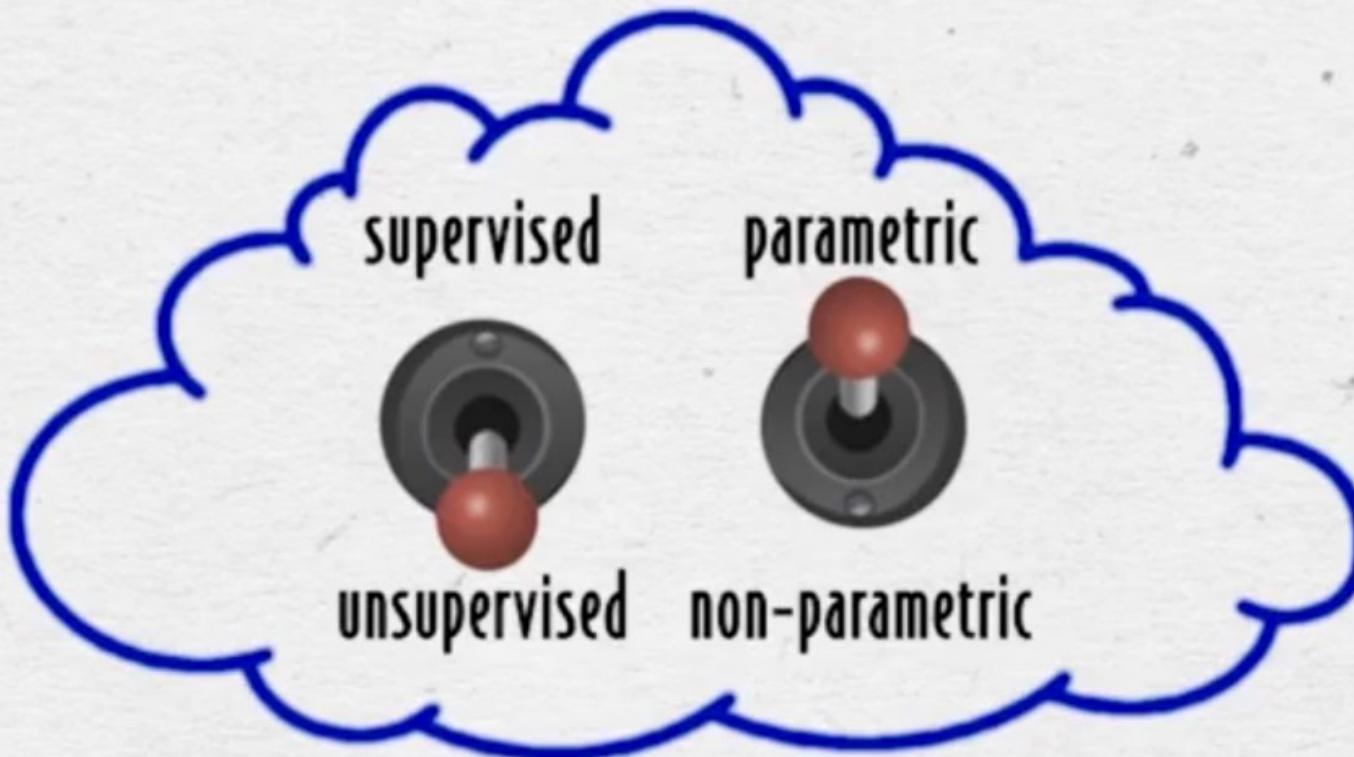
Parametric vs. Non-Parametric Learning

parametric: trial and error learning

non-parametric: counting and probability



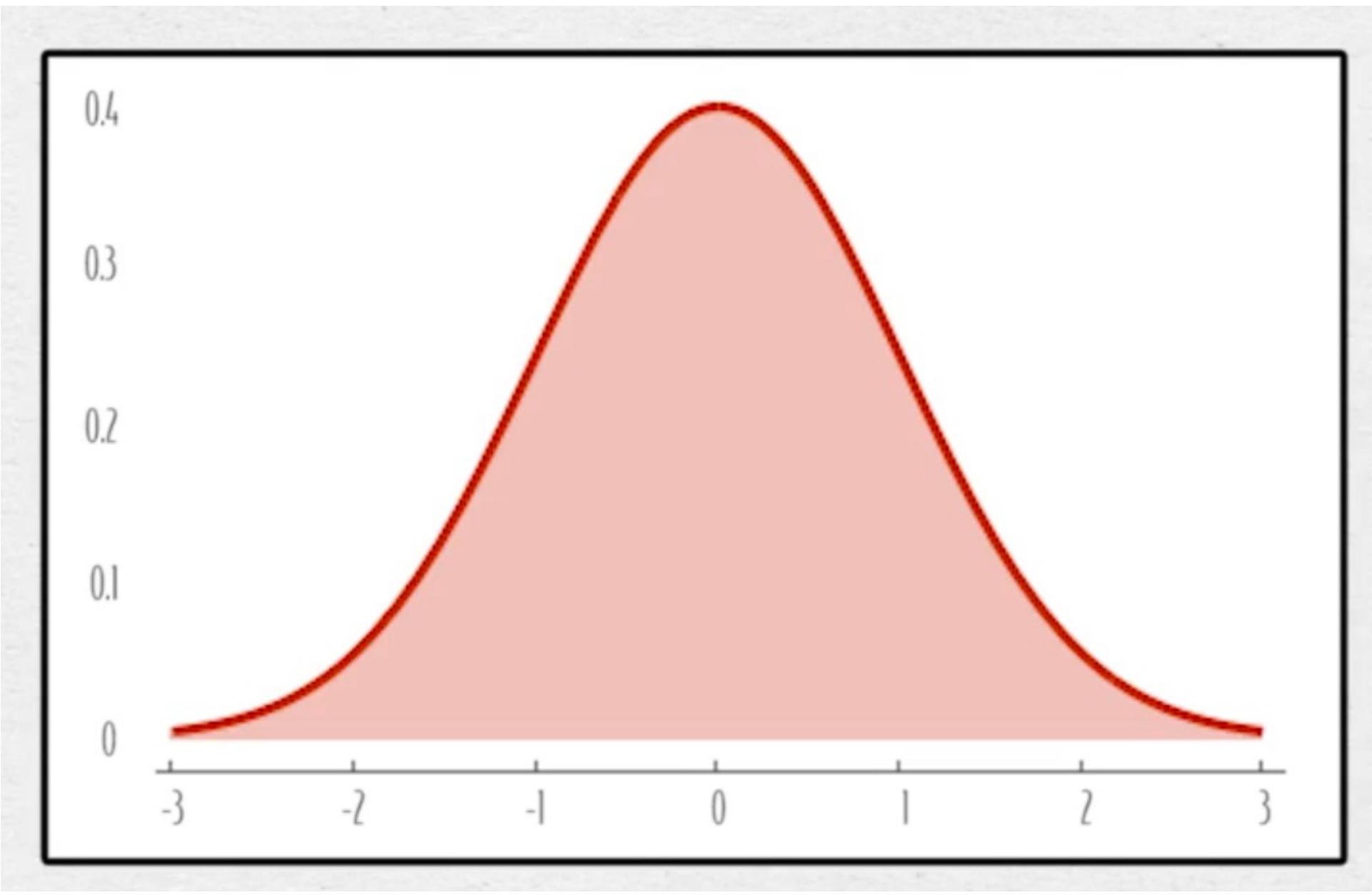




parametric - fixed number of parameters

non-parametric - possibly infinite parameters





Supervised Parametric Learning

Data

```
0010110001101001  
1000110001110010  
0101101000110101
```

Machine



Prediction

98%

Supervised Parametric Learning



Data

win/loss
record

number of
toes

Machine



Prediction

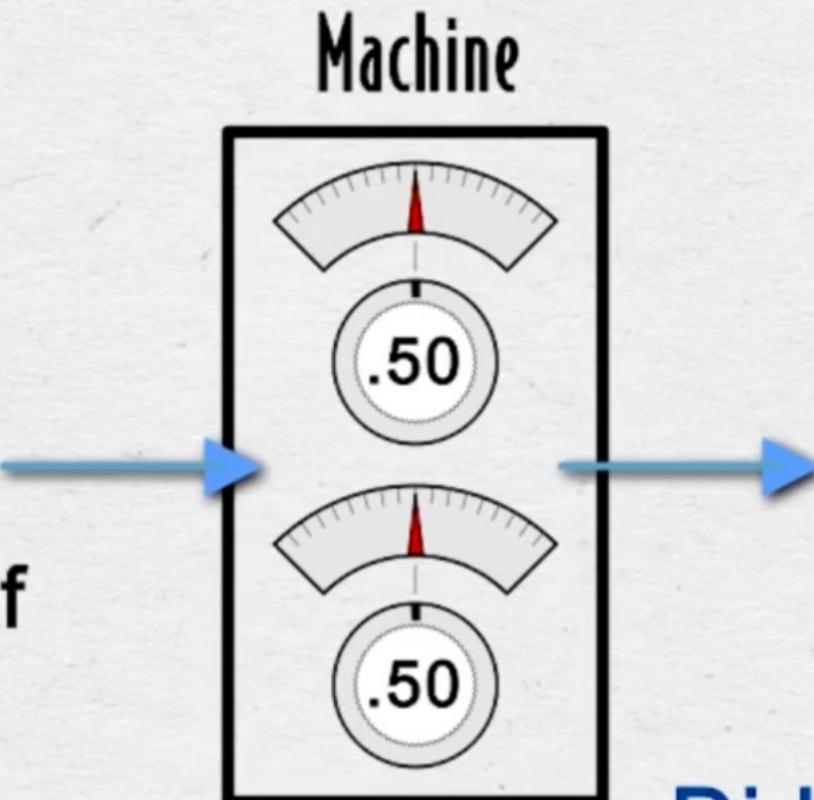
98%

Did the Tigers win?
No.

Supervised Parametric Learning



Data
win/loss record
number of toes



Prediction

98%

Did the Tigers win?

Supervised Parametric Learning



Data

win/loss
record

number of
toes

Machine



Prediction

98%

Did the Tigers win?
No.

Supervised Parametric Learning



Data

win/loss
record

number of
toes

Machine

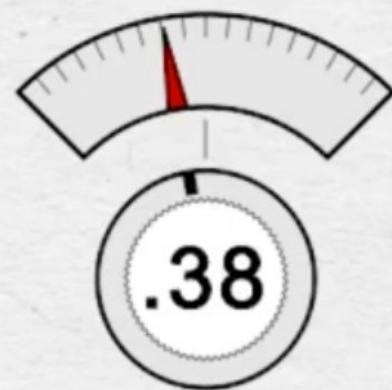


Prediction

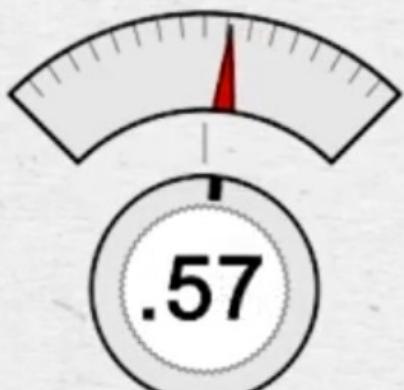
98%

Search Algorithm

parametric

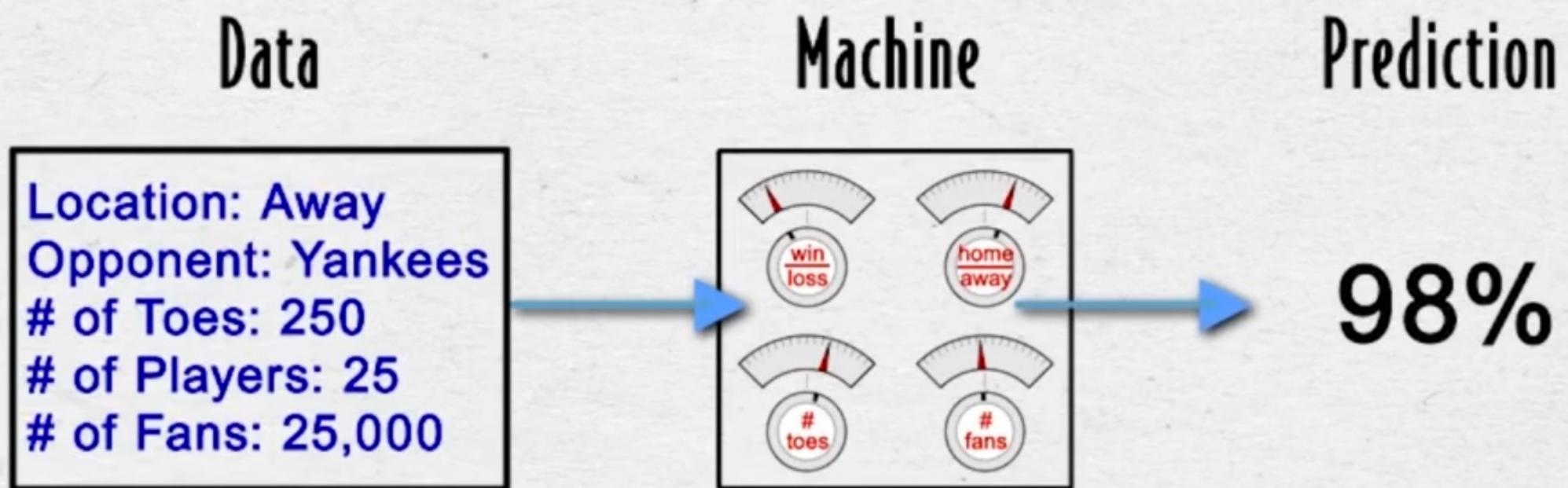


parametric



Supervised Parametric Learning

Step 1: Predict



Supervised Parametric Learning

Step 1: Predict

Step 2: Compare to Truth Pattern

Prediction: 98% > Truth: 0%

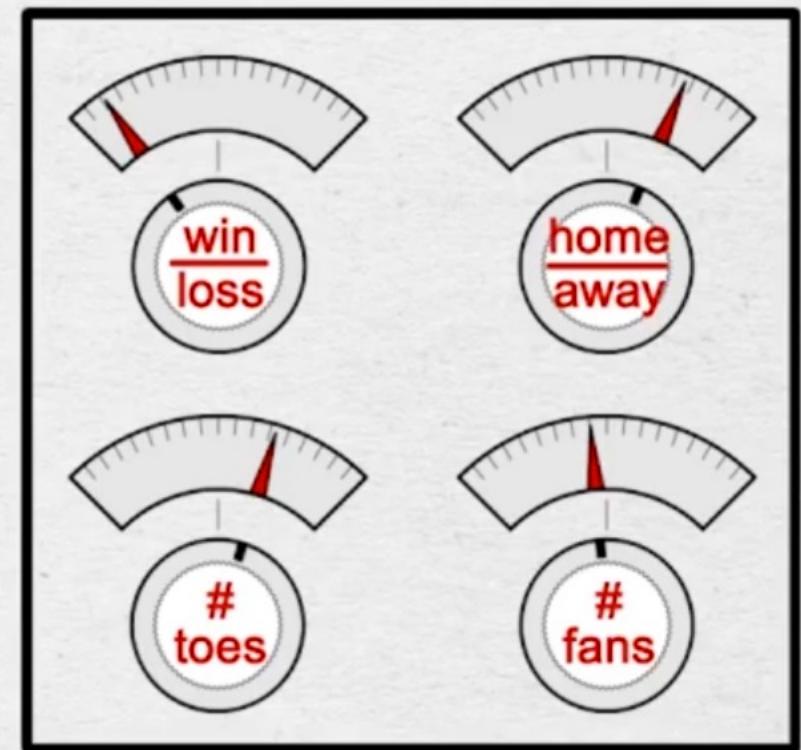
Supervised Parametric Learning

Step 1: Predict

Step 2: Compare to Truth Pattern

Step 3: Learn the Pattern

Adjusting Sensitivity
by Turning Knobs



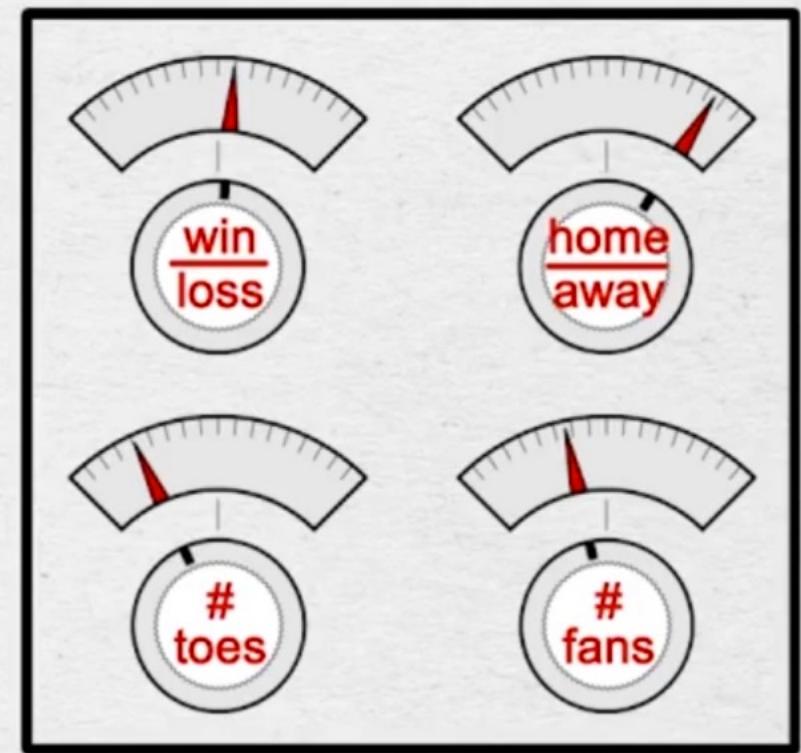
Supervised Parametric Learning

Step 1: Predict

Step 2: Compare to Truth Pattern

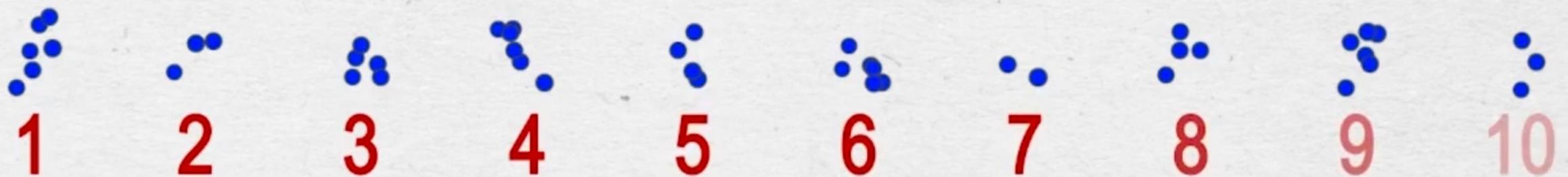
Step 3: Learn the Pattern

Adjusting Sensitivity
by Turning Knobs



Unsupervised Parametric Learning

Clusters



Unsupervised Parametric Learning

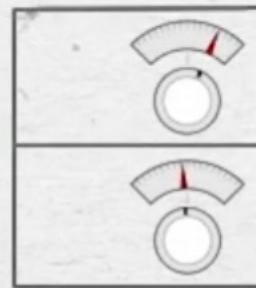
home/away	#fans
home	100k
away	50k
home	100k
home	99k
away	50k
away	10k
away	11k

Datapoint

home/away	#fans
home	100k

Group
Membership
Probability

group 1



group 2



group 3

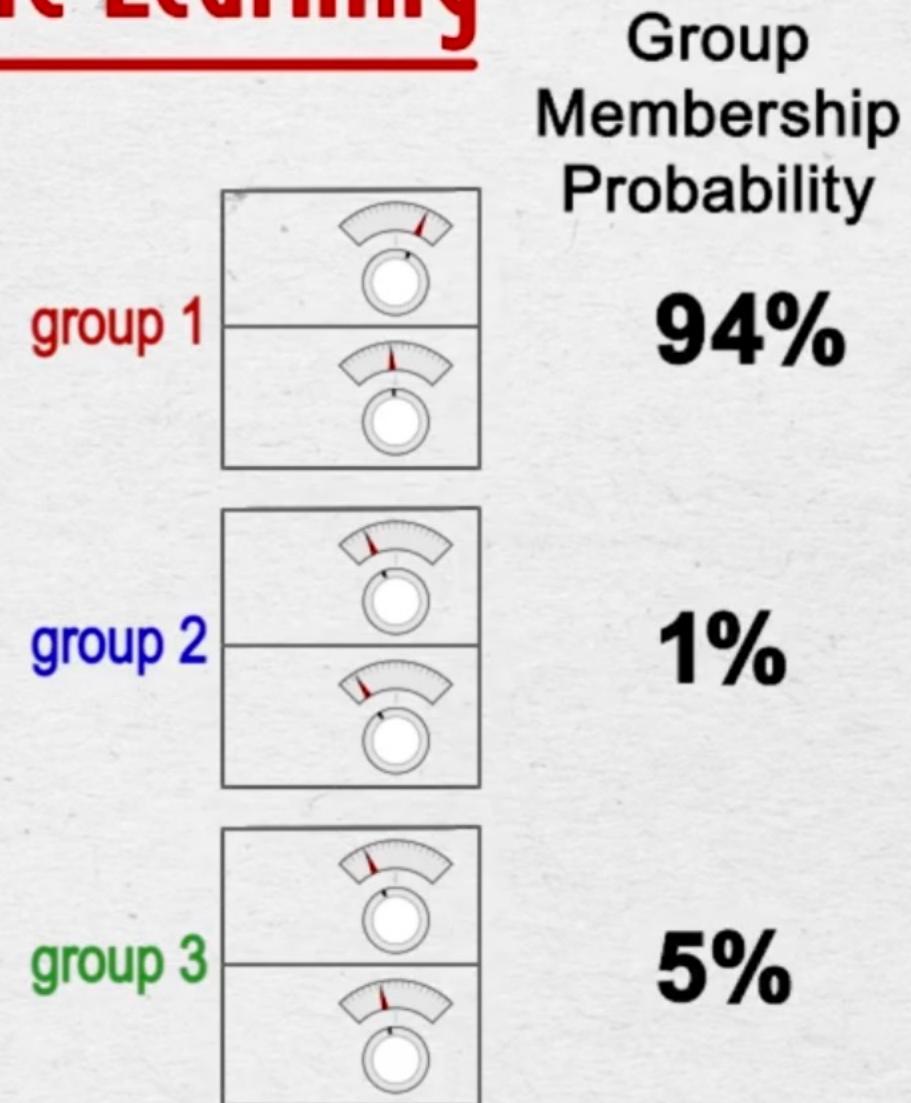


Unsupervised Parametric Learning

home/away	#fans
home	100k
away	50k
home	100k
home	99k
away	50k
away	10k
away	11k

Datapoint

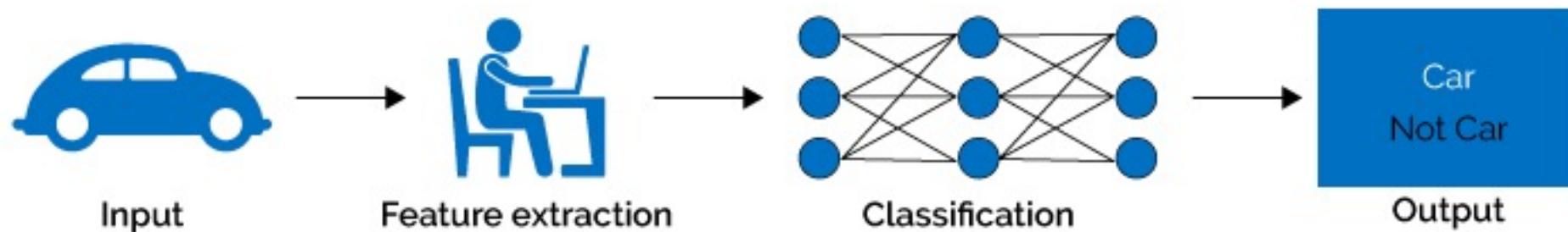
home/away	#fans
home	100k



Non-Parametric Learning

parameters based on data

Machine Learning



Deep Learning

