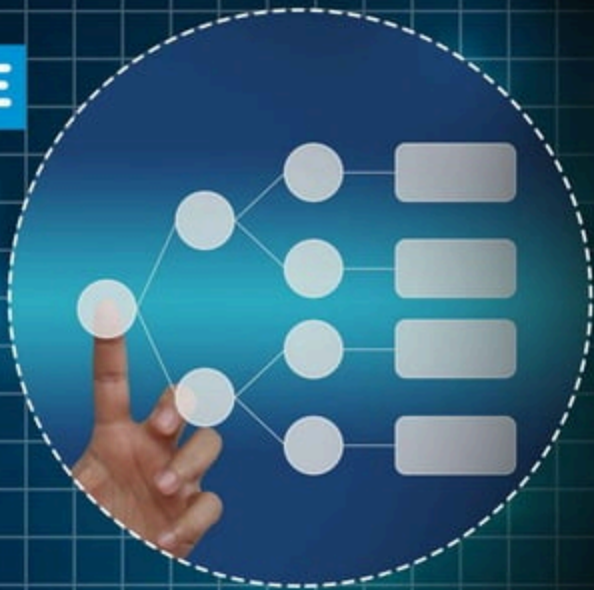


DECISION TREE TUTORIAL



simpli|learn



Decision Tree Tutorial



Decision Tree Tutorial



Decision Tree Tutorial



Decision Tree Tutorial



Decision Tree Tutorial

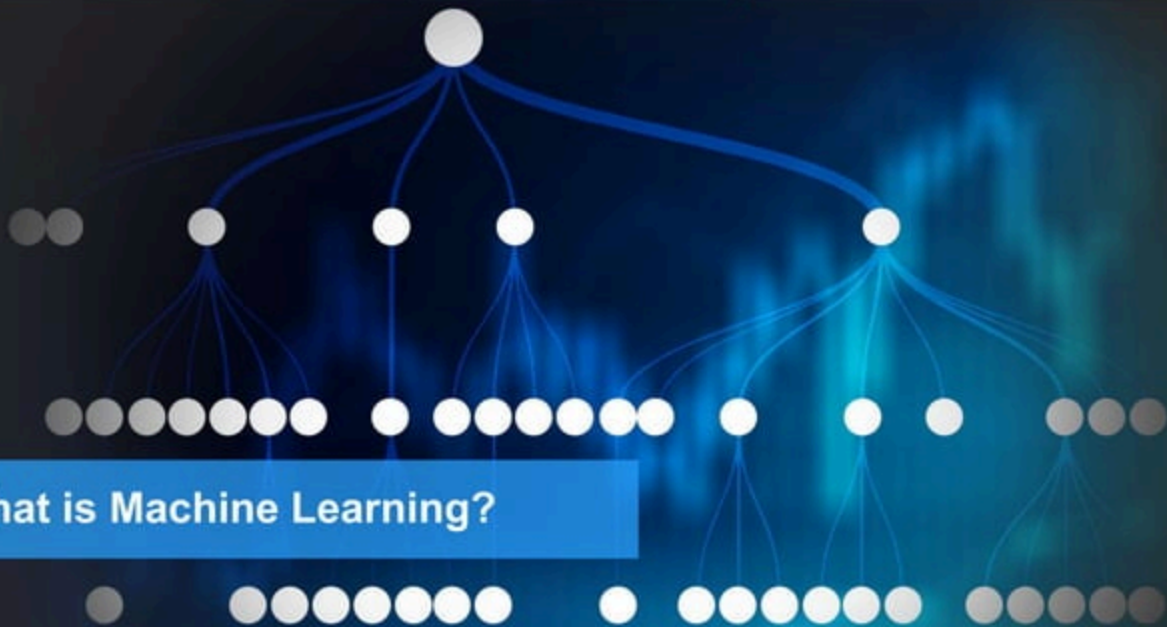


This seems good

What's in it for you?

- ▶ What is Machine Learning?
- ▶ Types of Machine Learning
- ▶ Problems in Machine Learning
- ▶ What is Decision Tree?
- ▶ What are the problems a Decision Tree solves?
- ▶ Advantages of Decision Tree
- ▶ Disadvantages of Decision Tree
- ▶ How does Decision Tree work?
- ▶ Use Case – Loan repayment prediction





What is Machine Learning?



What is Machine Learning?



What is Machine Learning?

Artificial Intelligence



What is Machine Learning?

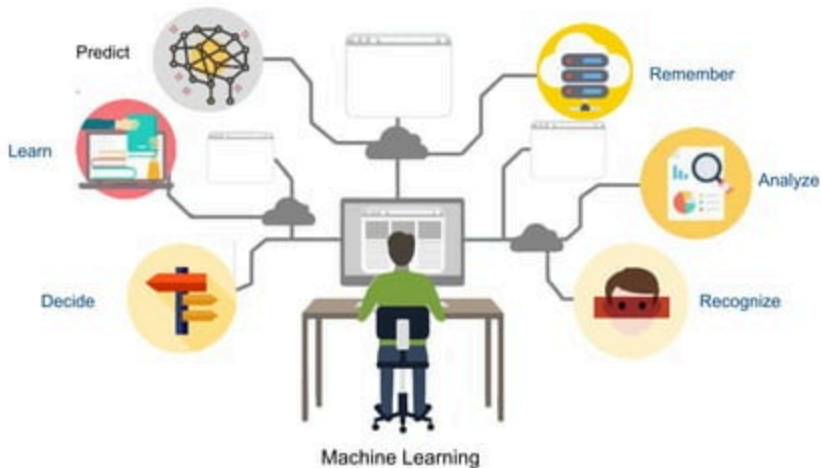
Artificial Intelligence



What is Machine Learning?



What is Machine Learning?



What is Machine Learning?

Machine Learning is an application of Artificial Intelligence wherein the system gets the ability to automatically learn and improve based on experience



Ordinary system

What is Machine Learning?

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Ordinary system



With Artificial Intelligence

What is Machine Learning?

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Ordinary system



Ability to learn and improve on its own

What is Machine Learning?

Machine Learning is an application of Artificial Intelligence wherein the system gets the ability to automatically learn and improve based on experience



Ordinary system



Ability to learn and improve on its own



Machine Learning



Types of Machine Learning

Types of Machine Learning



Supervised Learning

Types of Machine Learning



Supervised Learning



Unsupervised Learning

Types of Machine Learning



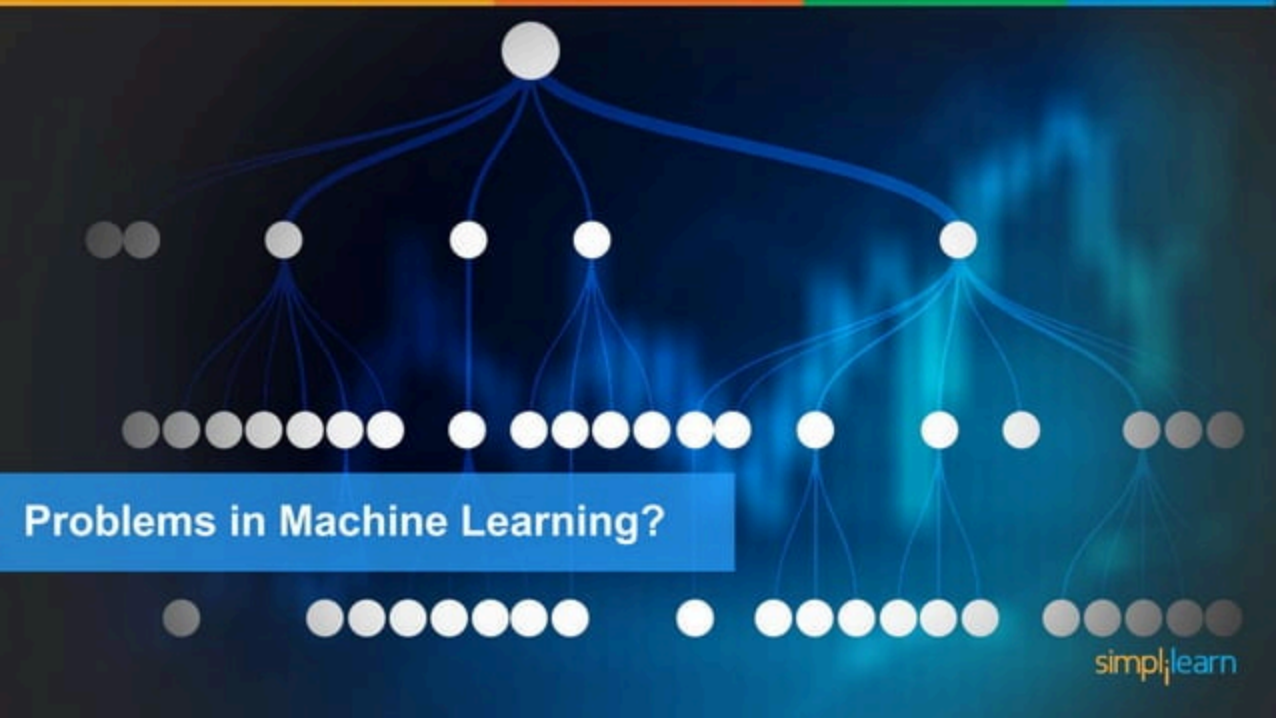
Supervised Learning



Unsupervised Learning



Reinforcement Learning



Problems in Machine Learning?

Problems in Machine Learning



Classification

Problems with categorical solutions like 'Yes' or 'No', 'True' or 'False', '1' or '0'

Problems in Machine Learning



Classification

Problems with categorical solutions like 'Yes' or 'No', 'True' or 'False', '1' or '0'



Regression

Problems wherein continuous value needs to be predicted like 'Product Prices', 'Profit'

Problems in Machine Learning



Classification

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Problems wherein continuous value needs to be predicted like 'Product Prices', 'Profit'



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Problems wherein the data needs to be organized to find specific patterns like in the case of 'Product Recommendation'

Problems in Machine Learning



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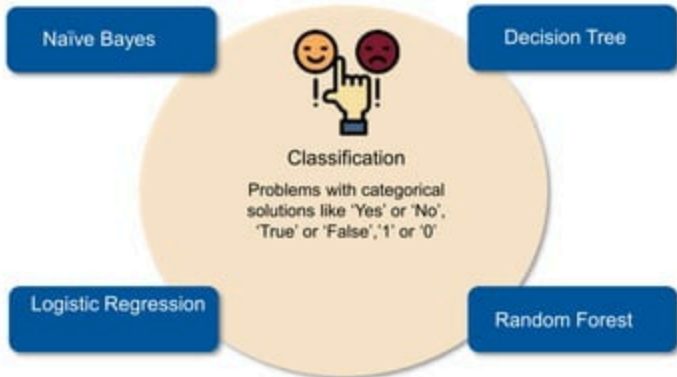
Problems in Machine Learning



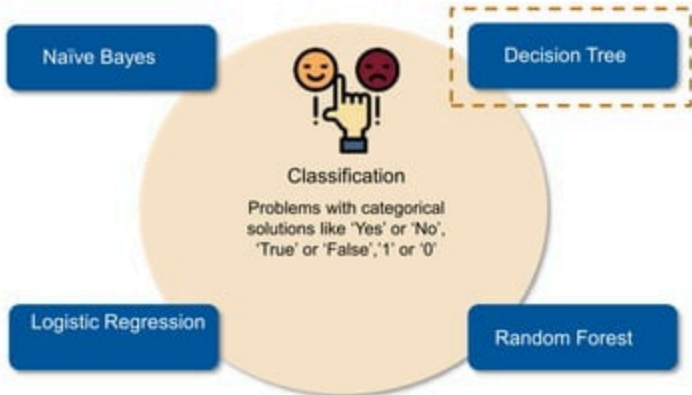
Classification

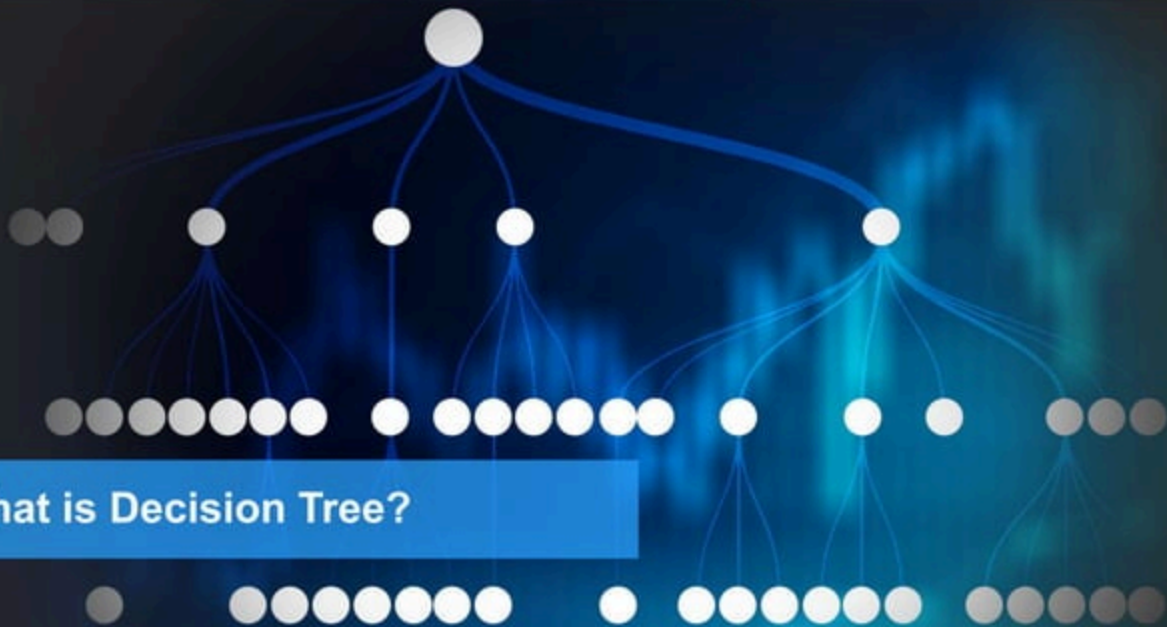
Problems with categorical solutions like 'Yes' or 'No', 'True' or 'False', '1' or '0'

Problems in Machine Learning



Problems in Machine Learning





What is Decision Tree?

What is Decision Tree?

Decision Tree is a tree shaped diagram used to determine a course of action. Each branch of the tree represents a possible decision, occurrence or reaction

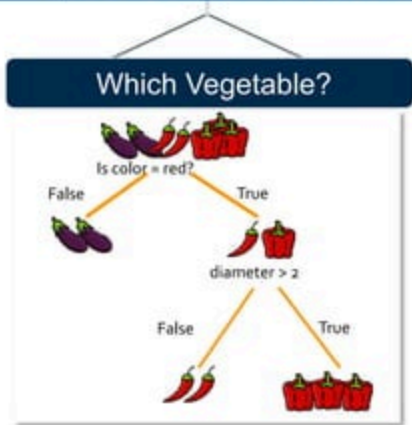
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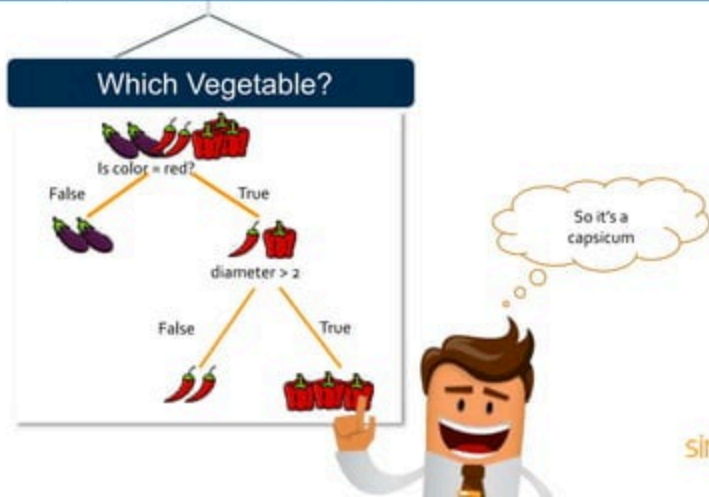
What is Decision Tree?

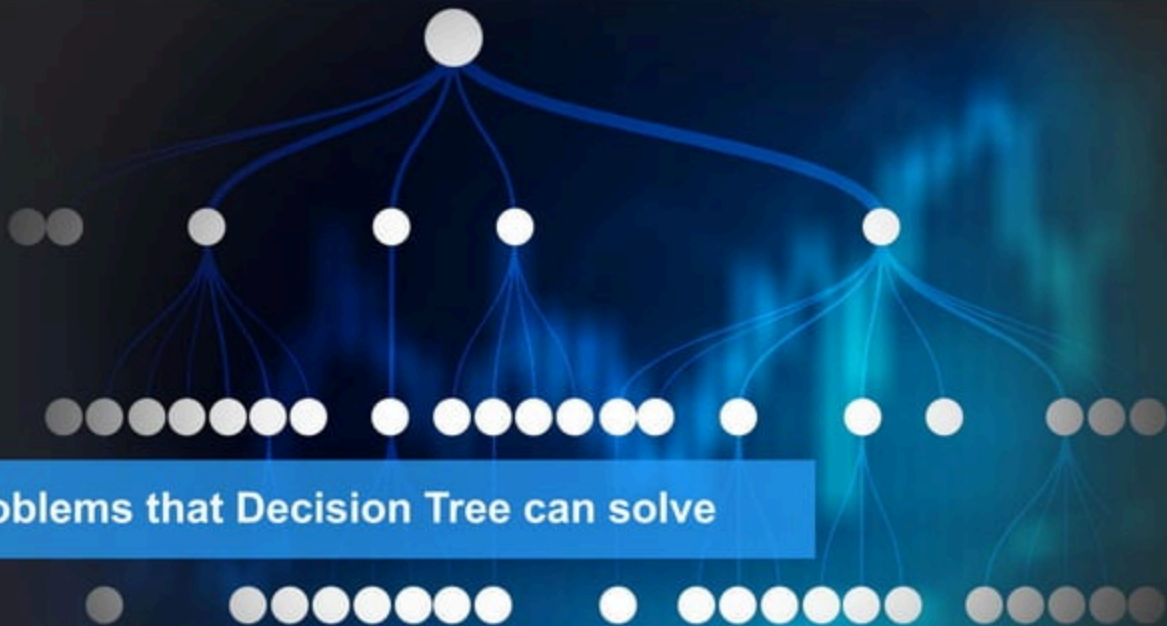
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What is Decision Tree?

Decision Tree is a tree shaped diagram used to determine a course of action. Each branch of the tree represents a possible decision, occurrence or reaction





Problems that Decision Tree can solve

Problems that Decision Tree can solve

Classification



Regression

Problems that Decision Tree can solve

Classification

A classification tree will determine a set of logical if-then conditions to classify problems.
For example, discriminating between three types of flowers based on certain features



Regression

Problems that Decision Tree can solve

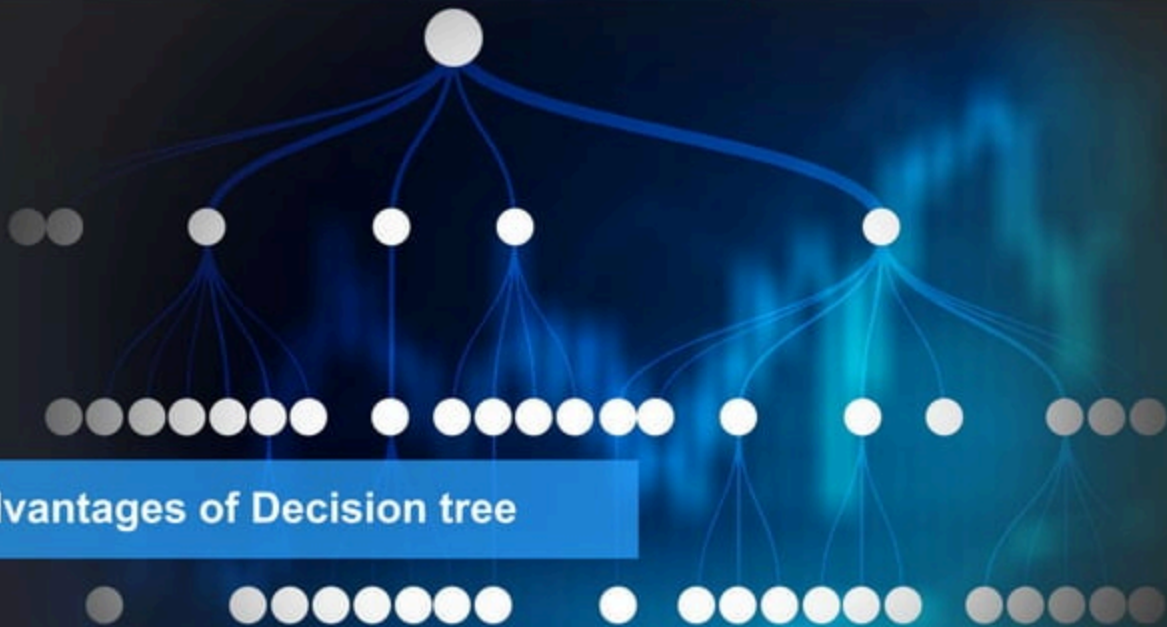
Classification

A classification tree will determine a set of logical if-then conditions to classify problems.
For example, discriminating between three types of flowers based on certain features



Regression

Regression tree is used when the target variable is numerical or continuous in nature. We fit a regression model to the target variable using each of the independent variables. Each split is made based on the sum of squared error.



Advantages of Decision tree

Advantages of Decision Tree



Advantages of Decision Tree

Simple to understand, interpret and visualize



Advantages of Decision Tree

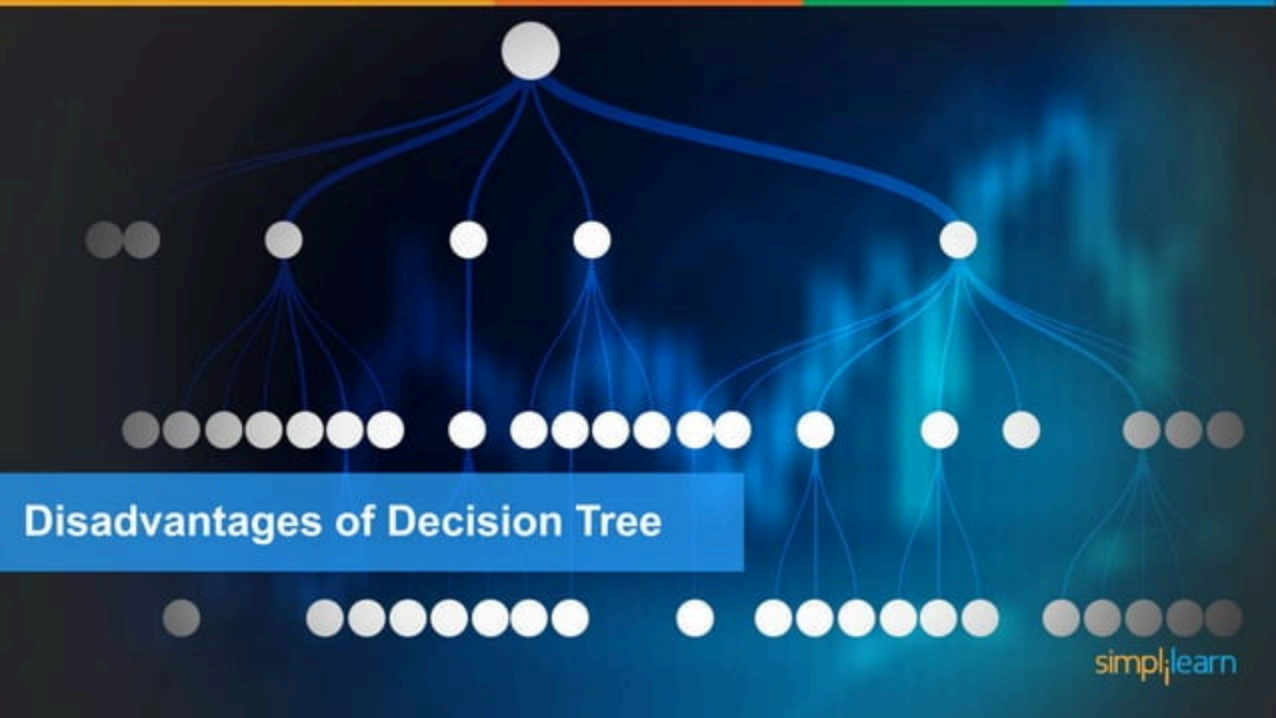


Advantages of Decision Tree



Advantages of Decision Tree





Disadvantages of Decision Tree

Disadvantages of Decision Tree

Overfitting occurs when the algorithm captures noise in the data

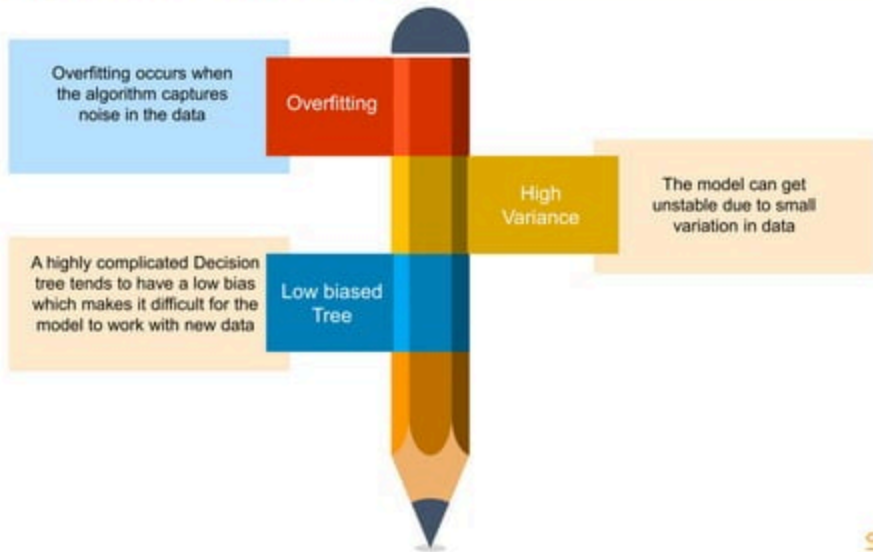
Overfitting

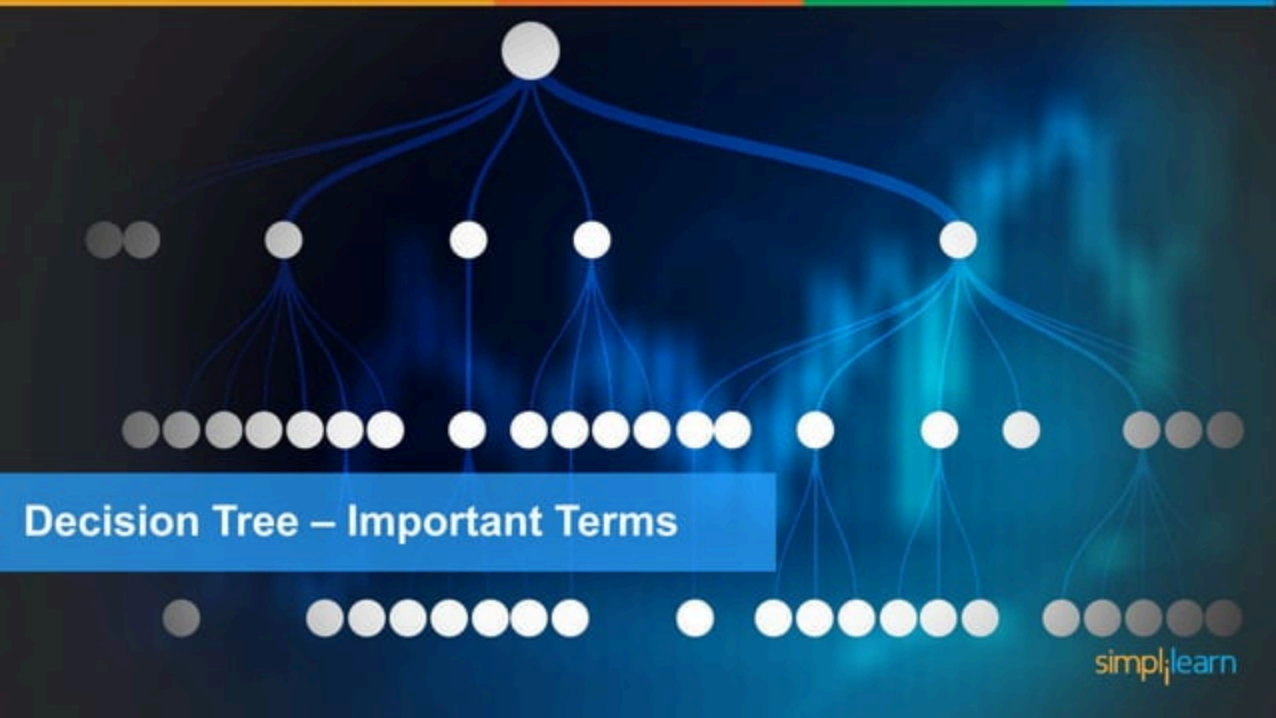


Disadvantages of Decision Tree



Disadvantages of Decision Tree





Decision Tree – Important Terms

Decision Tree – Important Terms



Decision Tree – Important Terms

Entropy

Entropy is the measure of randomness or unpredictability in the dataset

Example



This Dataset has a very high entropy

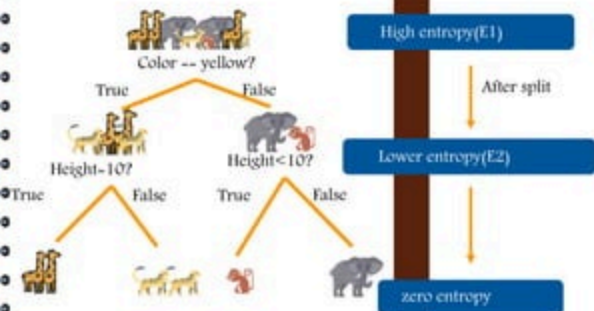
High entropy

Decision Tree – Important Terms

Entropy

Entropy is the measure of randomness or unpredictability in the dataset

Example

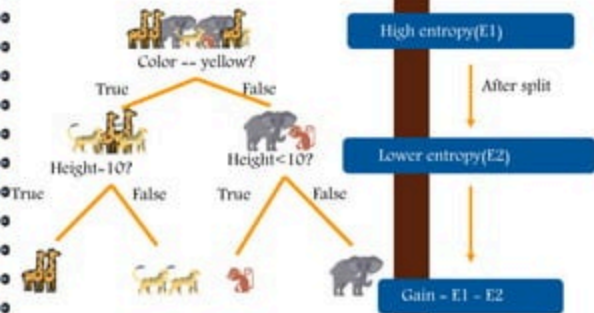


Decision Tree – Important Terms

Information gain

It is the measure of decrease in entropy after the dataset is split

Example

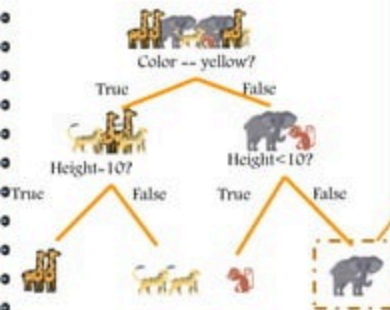


Decision Tree – Important Terms

Leaf Node

Leaf node carries the classification or the decision

Example



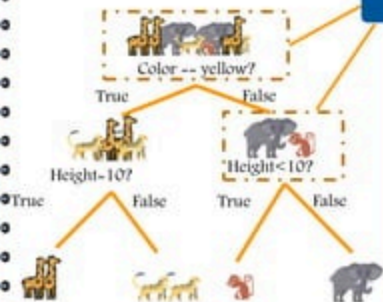
Leaf Node

Decision Tree – Important Terms

Decision Node

Decision node has two or more branches

Example



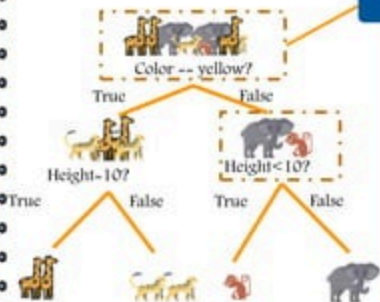
decision Node

Decision Tree – Important Terms

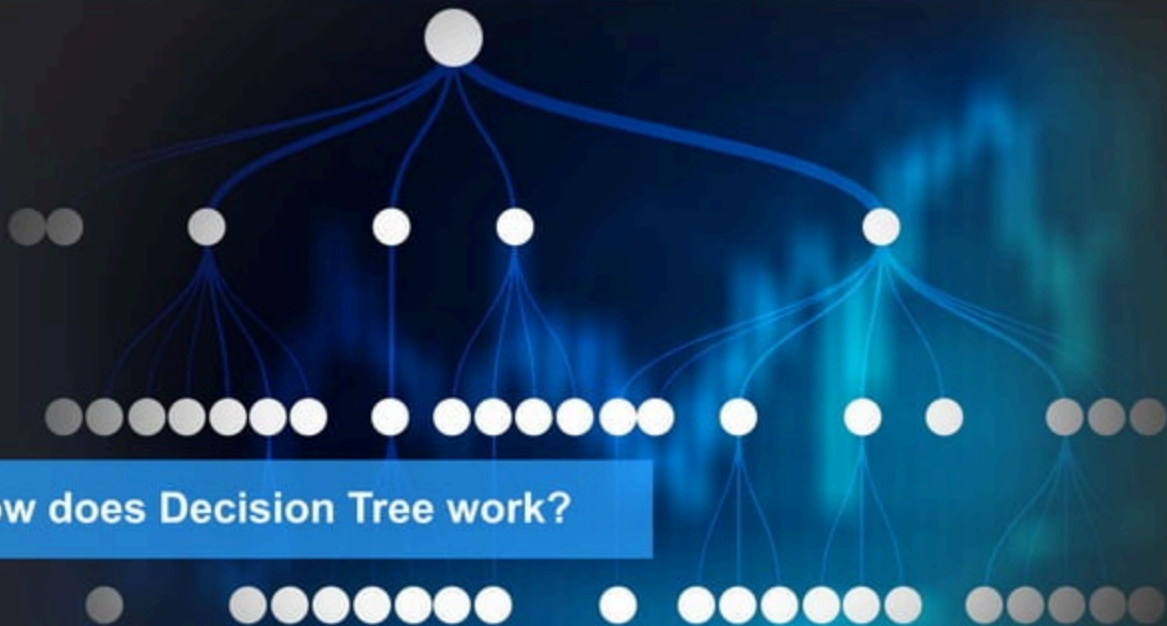
Root Node

The top most Decision node is known as the Root node

Example



Root Node

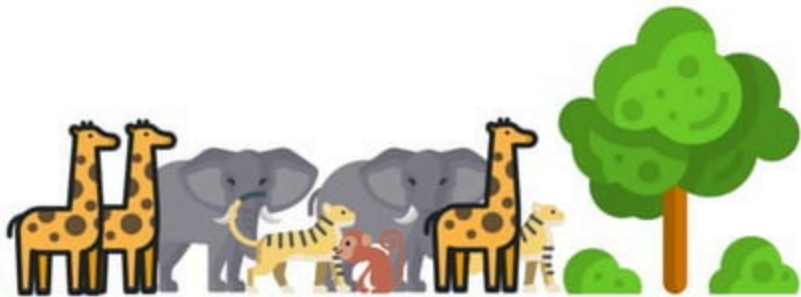


How does Decision Tree work?

How does a Decision Tree work?



How does a Decision Tree work?



How does a Decision Tree work?

Let's try to classify different types of animals based on their features using a Decision Tree



How does a Decision Tree work?

Problem statement

To classify the different types of animals based on their features using decision tree



How does a Decision Tree work?

Problem statement

To classify the different types of animals based on their features using decision tree

The dataset is looking quite messy and the entropy is high in this case



How does a Decision Tree work?

The dataset is looking quite messy and the entropy is high in this case



Training Dataset

Color	Height	Label
grey	10	elephant
Yellow	10	giraffe
brown	3	Monkey
grey	10	elephant
Yellow	4	Tiger

How does a Decision Tree work?

How to split the data

We have to frame the conditions that split the data in such a way that the information gain is the highest



How does a Decision Tree work?

How to split the data

We have to frame the conditions that split the data in such a way that the information gain is the highest

Note

Gain is the measure of decrease in entropy after splitting



How does a Decision Tree work?

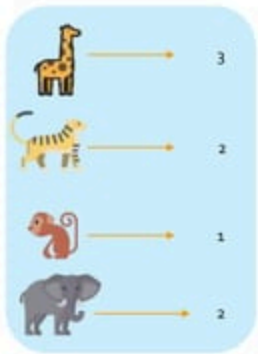
Formula for entropy

$$\sum_{i=1}^k P(\text{value}_i) \cdot \log_2(P(\text{value}_i))$$

Let's try to calculate the entropy for the current dataset



How does a Decision Tree work?



total 8



How does a Decision Tree work?

Let's use the formula

$$\sum_{i=1}^k P(\text{value}_i) \cdot \log_2(P(\text{value}_i))$$



How does a Decision Tree work?

Let's use the formula

$$\sum_{i=1}^k P(\text{value}_i) \cdot \log_2(P(\text{value}_i))$$

$$\text{Entropy} = \left(\frac{3}{8}\right) \log_2\left(\frac{3}{8}\right) + \left(\frac{2}{8}\right) \log_2\left(\frac{2}{8}\right) + \left(\frac{1}{8}\right) \log_2\left(\frac{1}{8}\right) + \left(\frac{2}{8}\right) \log_2\left(\frac{2}{8}\right)$$

$$\text{Entropy} = 0.571$$



How does a Decision Tree work?

Let's use the formula

$$\sum_{i=1}^k P(\text{value}_i) \cdot \log_2(P(\text{value}_i))$$

$$\text{Entropy} = \left(\frac{3}{8}\right) \log_2\left(\frac{3}{8}\right) + \left(\frac{3}{8}\right) \log_2\left(\frac{3}{8}\right) + \left(\frac{1}{8}\right) \log_2\left(\frac{1}{8}\right) + \left(\frac{1}{8}\right) \log_2\left(\frac{1}{8}\right)$$

$$\text{Entropy} = 0.571$$



We will calculate the entropy of the dataset similarly after every split to calculate the gain

How does a Decision Tree work?



Gain can be calculated by finding the difference of the subsequent entropy values after split

How does a Decision Tree work?

Now we will try to choose a condition that gives us the highest gain



How does a Decision Tree work?

Now we will try to choose a condition that gives us the highest gain



We will do that by splitting the data using each condition and checking the gain that we get out them.

How does a Decision Tree work?

The condition that gives us the highest gain will be used to make the first split



We will do that by splitting the data using each condition and checking the gain that we get out them.

How does a Decision Tree work?

Conditions

Color==Yellow?

Height>=10

Color==Brown?

Color==Grey

Diameter<10

Training Dataset

Color	Height	Label
grey	10	elephant
Yellow	10	giraffe
brown	3	Monkey
grey	10	elephant
Yellow	4	Tiger



How does a Decision Tree work?

Conditions

Color== Yellow?

Height>=10

Color== Brown?

Color== Grey

Diameter<10

Let's say this condition gives us the maximum gain

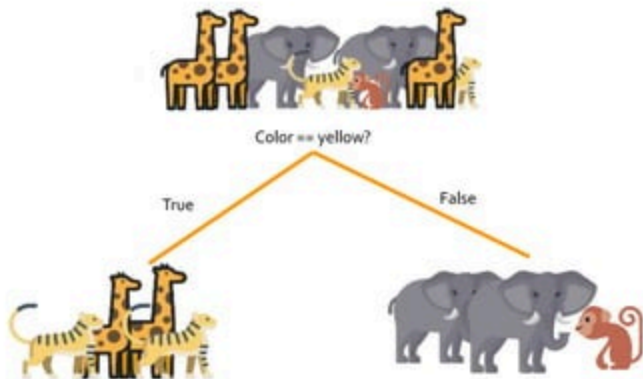


Training Dataset

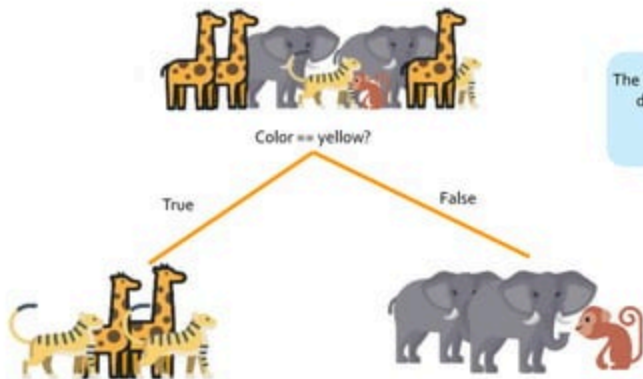
Color	Height	Label
grey	10	elephant
Yellow	10	giraffe
brown	3	Monkey
grey	10	elephant
Yellow	4	Tiger

How does a Decision Tree work?

We split the data



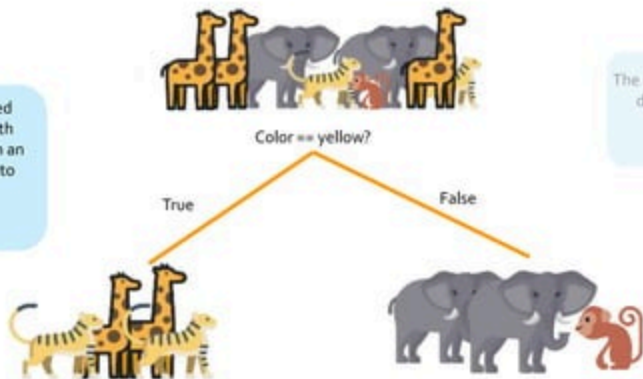
How does a Decision Tree work?



The entropy after splitting has decreased considerably

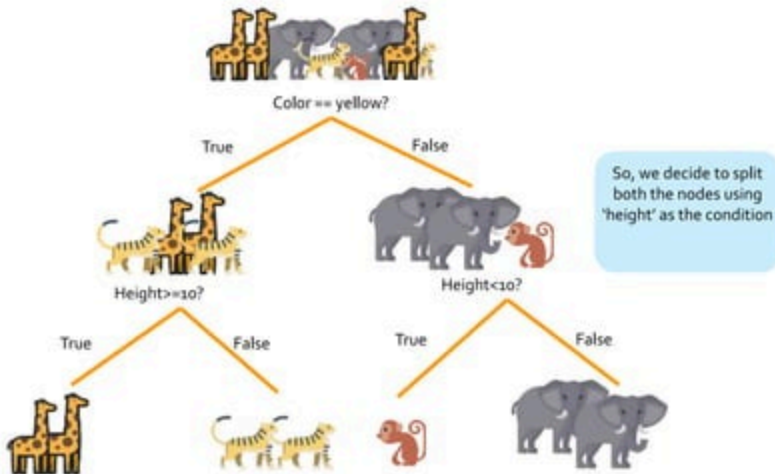
How does a Decision Tree work?

however we still need some splitting at both the branches to attain an entropy value equal to zero

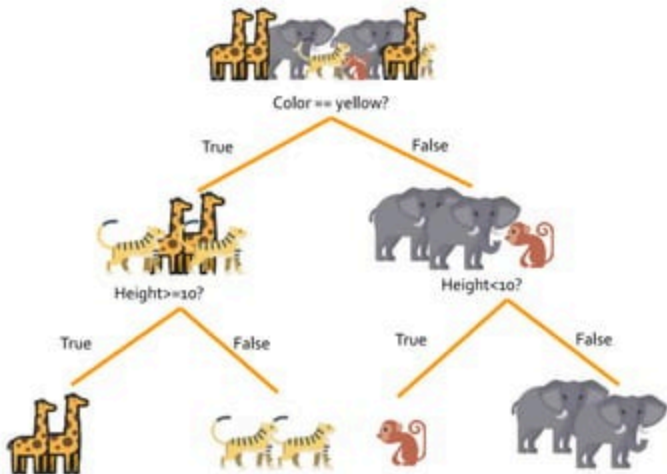


The entropy after splitting has decreased considerably

How does a Decision Tree work?

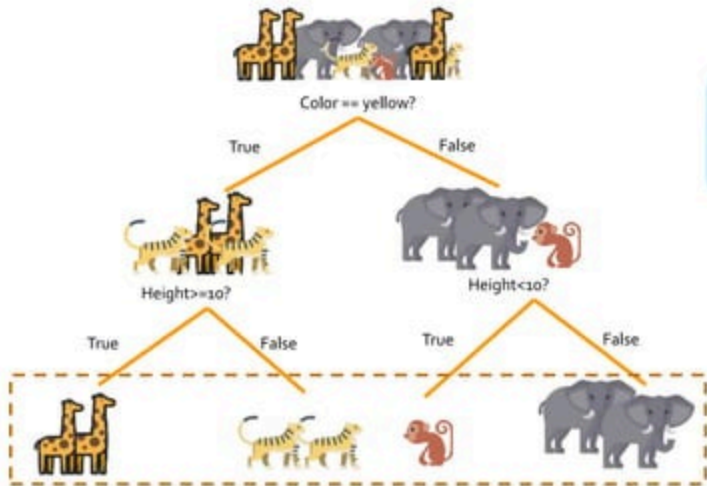


How does a Decision Tree work?



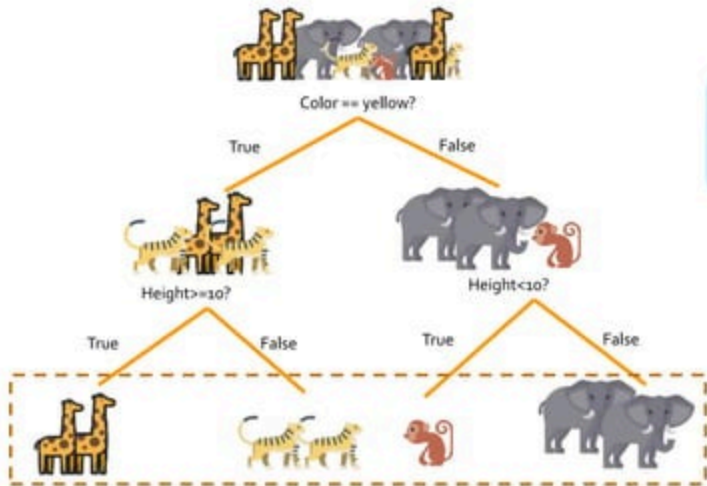
since every branch now contains single label type, we can say that the entropy in this case has reached the least value

How does a Decision Tree work?

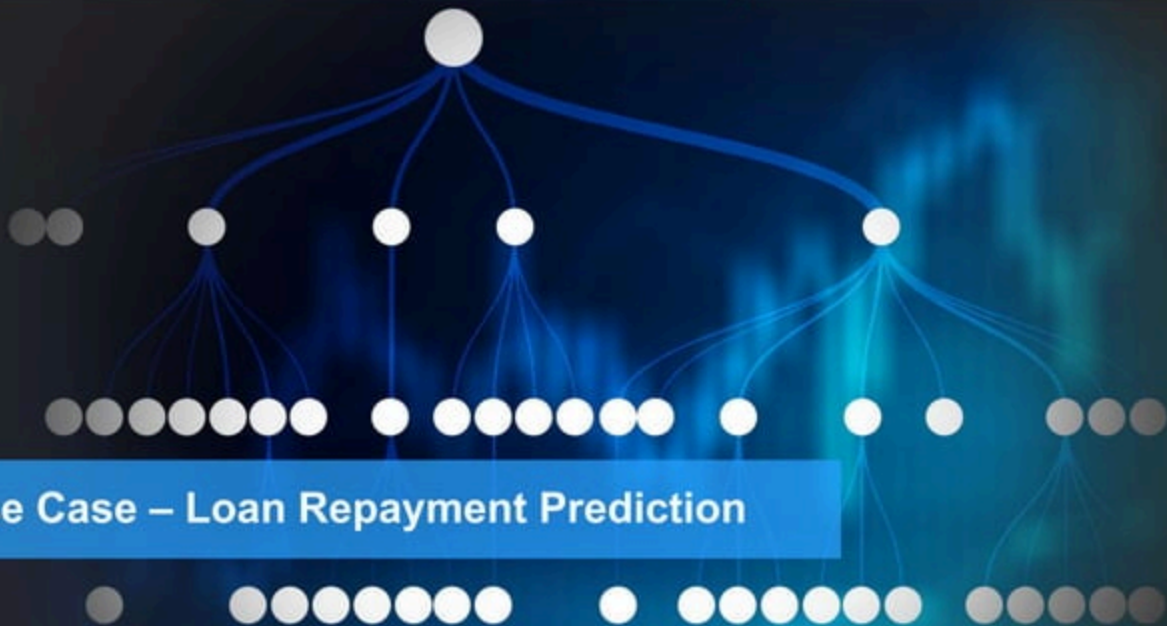


This Tree can now predict all the classes of animals present in the dataset with 100% accuracy

How does a Decision Tree work?



This Tree can now predict all the classes of animals present in the dataset with 100% accuracy



Use Case – Loan Repayment Prediction

Use Case – Loan Repayment prediction



Use Case – Problem Statement



Problem statement

To predict if a customer will repay loan amount or not using Decision Tree algorithm in python

Use Case – Implementation

```
#import the necessary packages
import numpy as np
import pandas as pd
from sklearn.cross_validation import train_test_split
from sklearn.tree import DecisionTreeClassifier
from sklearn.metrics import accuracy_score
from sklearn import tree

#Loading data file
balance_data =pd.read_csv('C:/Users/anirban.dey/Desktop/data_2.csv',
sep= ',', header= 0)
```



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Use Case – Implementation

```
#import the necessary packages
print ("Dataset Lenght:: "), len(balance_data)
print ("Dataset Shape:: "), balance_data.shape
```

```
Dataset Lenght::
Dataset Shape::
```

```
Out[166]: (None, (1000, 5))
```



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Use Case – Implementation

```
print ("Dataset:: ")  
balance_data.head()
```

Dataset::

Out[167]:

	Result	Initial payment	Last payment	Credit Score	House Number
0	Yes	201	10018	250	3046
1	Yes	205	10016	395	3044
2	Yes	257	10129	109	3251
3	Yes	246	10064	324	3137
4	Yes	117	10115	496	3094



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Use Case – Implementation

```
#Separating the Target variable
```

```
X = balance_data.values[:, 1:5]
```

```
Y = balance_data.values[:,0]
```

```
#Splitting Dataset into Test and Train
```

```
X_train, X_test, y_train, y_test = train_test_split( X, Y, test_size = 0.3,  
random_state = 100)
```

```
#Function to perform training with Entropy
```

```
clf_entropy = DecisionTreeClassifier(criterion = "entropy", random_state = 100,  
max_depth=3, min_samples_leaf=5)  
clf_entropy.fit(X_train, y_train)
```

```
Out[170]: DecisionTreeClassifier(class_weight=None, criterion='entropy', max_depth=3,  
max_features=None, max_leaf_nodes=None,  
min_impurity_decrease=0.0, min_impurity_split=None,  
min_samples_leaf=5, min_samples_split=2,  
min_weight_fraction_leaf=0.0, presort=False, random_state=100,  
splitter='best')
```



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Use Case – Implementation

```
#Function to make Predictions  
y_pred_en = clf_entropy.predict(X_test)  
y_pred_en
```

```
Out[171]: array(['Yes', 'Yes', 'No', 'Yes', 'No', 'Yes', 'Yes', 'Yes', 'No', 'No',  
                'No', 'No', 'Yes', 'No', 'No', 'Yes', 'Yes', 'No', 'Yes', 'No',  
                'No', 'Yes', 'No', 'Yes', 'Yes', 'No', 'No', 'Yes', 'No', 'No',  
                'No', 'Yes', 'Yes', 'Yes', 'Yes', 'No', 'No', 'No', 'Yes', 'No',  
                'Yes', 'Yes', 'Yes', 'No', 'No', 'Yes', 'Yes', 'Yes', 'No', 'No',  
                'Yes', 'No', 'Yes', 'Yes', 'Yes', 'Yes', 'No', 'Yes', 'No', 'Yes',  
                'Yes', 'No', 'Yes', 'Yes', 'No', 'Yes', 'Yes', 'Yes', 'No', 'No',  
                'No', 'No', 'No', 'Yes', 'No', 'Yes', 'Yes', 'No', 'Yes', 'No',
```



Use Case – Implementation

```
#Checking Accuracy  
print ("Accuracy is "), accuracy_score(y_test,y_pred)*100
```

Accuracy is

Out[172]: (None, 94.666666666666671)



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Use Case



So, we have created a model that uses decision tree algorithm to predict whether a customer will repay the loan or not

Use Case



The Accuracy of the model is 94.6%

Use Case



The bank can use this model to decide whether it should approve loan request from a particular customer or not

Key takeaways

What is Machine Learning?

Machine learning is a process of training computers to learn from data without being explicitly programmed to do so.



Training Data



Model Training



Machine Learning

Source: Simplilearn

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Types of Machine Learning



Supervised Learning



Unsupervised Learning



Reinforcement Learning

Source: Simplilearn

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Problems in Machine Learning



Overfitting

Model is too closely tailored to a specific dataset and therefore fails to generalize to new data.



Underfitting

Model is too simple and fails to capture the underlying patterns in the data.



Bias/Variance

Model is either too biased (underfitting) or too variances (overfitting).

Source: Simplilearn

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How does a Decision Tree work?



Source: Simplilearn

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Use Case



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THANK YOU

For more information, visit

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