

Data Mining

Lab - 10

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# Implement Decision Tree(ID3) in python

Uses Information Gain to choose the best feature to split.

Recursively builds the tree until stopping conditions are met.

- 1. Calculate Entropy for the dataset.
- 2. Calculate Information Gain for each feature.
- 3. Choose the feature with maximum Information Gain.
- 4. Split dataset into subsets for that feature.
- 5. Repeat recursively until:

All samples in a node have the same label.

No features are left.

No data is left.

Step 2. Import the dataset from this address.

### import Pandas, Numpy

import pandas as pd import numpy as np

## **Create Following Data**

```
In [45]:
                               data = pd.DataFrame({
                                               'Outlook': ['Sunny', 'Sunny', 'Overcast', 'Rain', 'Rain', 'Rain', 'Overcast'
                                               'Temperature': ['Hot', 'Hot', 'Hot', 'Mild', 'Cool', 'Cool', 'Cool', 'Mild',
                                              'Humidity': ['High', 'High', 'High', 'Normal', 'Normal', 'Normal',
                                               'Wind': ['Weak', 'Strong', 'Weak', 'Weak', 'Strong', 'Strong', 'Weak
                                               'PlayTennis': ['No', 'No', 'Yes', 'Yes', 'No', 'Yes', 'No', 'Yes', 'Yes'
                                })
In [47]:
                               data
Out[47]:
                                              Outlook Temperature Humidity
                                                                                                                                                           Wind PlayTennis
                                     0
                                                                                                                                                            Weak
                                                                                                                                                                                                        No
                                                      Sunny
                                                                                                       Hot
                                                                                                                                      High
                                                                                                                                      High Strong
                                                      Sunny
                                                                                                        Hot
                                                                                                                                                                                                        No
                                              Overcast
                                                                                                       Hot
                                                                                                                                      High
                                                                                                                                                          Weak
                                                                                                                                                                                                        Yes
                                     3
                                                           Rain
                                                                                                      Mild
                                                                                                                                      High
                                                                                                                                                           Weak
                                                                                                                                                                                                        Yes
                                     4
                                                                                                     Cool
                                                                                                                               Normal
                                                           Rain
                                                                                                                                                           Weak
                                                                                                                                                                                                        Yes
                                     5
                                                           Rain
                                                                                                      Cool
                                                                                                                               Normal Strong
                                                                                                                                                                                                        No
                                                                                                     Cool
                                              Overcast
                                                                                                                               Normal Strong
                                                                                                                                                                                                        Yes
                                     7
                                                      Sunny
                                                                                                      Mild
                                                                                                                                      High
                                                                                                                                                           Weak
                                                                                                                                                                                                        No
                                     8
                                                                                                     Cool
                                                     Sunny
                                                                                                                               Normal
                                                                                                                                                           Weak
                                                                                                                                                                                                        Yes
                                     9
                                                           Rain
                                                                                                      Mild
                                                                                                                               Normal
                                                                                                                                                           Weak
                                                                                                                                                                                                        Yes
                                 10
                                                                                                      Mild
                                                      Sunny
                                                                                                                               Normal Strong
                                                                                                                                                                                                       Yes
                                 11
                                              Overcast
                                                                                                      Mild
                                                                                                                                      High Strong
                                                                                                                                                                                                        Yes
                                 12 Overcast
                                                                                                       Hot
                                                                                                                               Normal
                                                                                                                                                            Weak
                                                                                                                                                                                                        Yes
                                 13
                                                           Rain
                                                                                                      Mild
                                                                                                                                      High Strong
                                                                                                                                                                                                        No
```

## Now Define Function to Calculate Entropy

```
In [29]: def entropy(y):
    values, counts = np.unique(y, return_counts=True)
    print(values)
    print(counts)
    probabilities = counts / counts.sum()
    return -np.sum(probabilities * np.log2(probabilities))
```

# **Testing of Above Function -**

```
y = np.array(['Yes', 'No', 'Yes', 'Yes'])
Function Call - > entropy(y))
```

output - 0.8112781244591328

```
In [31]: y = np.array(['Yes', 'No', 'Yes', 'Yes'])
    print(entropy(y))

['No' 'Yes']
    [1 3]
    0.8112781244591328
```

#### **Define function to Calculate Information Gain**

```
In [33]: def information_gain(data, split_attribute, target):
    total_entropy = entropy(data[target])
    print(total_entropy)
    values, counts = np.unique(data[split_attribute], return_counts=True)
    print(values)
    print(counts)
    weighted_entropy = 0
    for v, c in zip(values, counts):
        subset = data[data[split_attribute] == v]
        weighted_entropy += (c / len(data)) * entropy(subset[target])
    return total_entropy - weighted_entropy
```

# **Testing of Above Function-**

```
data = pd.DataFrame({ 'Weather': ['Sunny', 'Sunny', 'Rain', 'Rain'], 'Play': ['Yes', 'No', 'Yes',
          'Yes'] })
          Function Call - > information_gain(data, 'Weather', 'Play')
          Output - 0.31127812445913283
In [35]: data = pd.DataFrame({
              'Weather': ['Sunny', 'Sunny', 'Rain', 'Rain'],
               'Play': ['Yes', 'No', 'Yes', 'Yes']
          })
          print(information_gain(data, 'Weather', 'Play'))
         ['No' 'Yes']
         [1 3]
        0.8112781244591328
         ['Rain' 'Sunny']
        [2 2]
         ['Yes']
        [2]
         ['No' 'Yes']
        [1 1]
        0.31127812445913283
```

### Implement ID3 Algo

```
In [37]: def id3(data, features, target):
    # If all labels are same → return the label
    if len(np.unique(data[target])) == 1:
```

```
return np.unique(data[target])[0]

# If no features left → return majority label
if len(features) == 0:
    return data[target].mode()[0]

# Choose best feature
gains = [information_gain(data, feature, target) for feature in features]
best_feature = features[np.argmax(gains)]

tree = {best_feature: {}}

# For each value of best feature → branch
for value in np.unique(data[best_feature]):
    sub_data = data[data[best_feature] == value].drop(columns=[best_feature]
    subtree = id3(sub_data, [f for f in features if f != best_feature], targ
    tree[best_feature][value] = subtree
return tree
```

### Use ID3

```
In [58]: features = list(data.columns[:-1])
   target = 'PlayTennis'

tree = id3(data, features, target)
```

```
['No' 'Yes']
[5 9]
0.9402859586706311
['Overcast' 'Rain' 'Sunny']
[4 5 5]
['Yes']
[4]
['No' 'Yes']
[2 3]
['No' 'Yes']
[3 2]
['No' 'Yes']
[5 9]
0.9402859586706311
['Cool' 'Hot' 'Mild']
[4 4 6]
['No' 'Yes']
[1 3]
['No' 'Yes']
[2 2]
['No' 'Yes']
[2 4]
['No' 'Yes']
[5 9]
0.9402859586706311
['High' 'Normal']
[7 7]
['No' 'Yes']
[4 3]
['No' 'Yes']
[1 6]
['No' 'Yes']
[5 9]
0.9402859586706311
['Strong' 'Weak']
[6 8]
['No' 'Yes']
[3 3]
['No' 'Yes']
[2 6]
['No' 'Yes']
[2 3]
0.9709505944546686
['Cool' 'Mild']
[2 3]
['No' 'Yes']
[1 1]
['No' 'Yes']
[1 2]
['No' 'Yes']
[2 3]
0.9709505944546686
['High' 'Normal']
[2 3]
['No' 'Yes']
[1 1]
['No' 'Yes']
[1 2]
['No' 'Yes']
[2 3]
```

```
0.9709505944546686
['Strong' 'Weak']
[2 3]
['No']
[2]
['Yes']
[3]
['No' 'Yes']
[3 2]
0.9709505944546686
['Cool' 'Hot' 'Mild']
[1 2 2]
['Yes']
[1]
['No']
[2]
['No' 'Yes']
[1 1]
['No' 'Yes']
[3 2]
0.9709505944546686
['High' 'Normal']
[3 2]
['No']
[3]
['Yes']
[2]
['No' 'Yes']
[3 2]
0.9709505944546686
['Strong' 'Weak']
[2 3]
['No' 'Yes']
[1 1]
['No' 'Yes']
[2 1]
```

### **Print Tree**