AIM To implement the Find-S algorithm in Python

# ALGORITHM

- 1 Initialize h to the most specific hypothesis in H
- For each positive training instance or

  For each attribute constraint a, in h

  If the constraint a, is satisfied by or

  Then do nothing

  Else replace a, in h by the next more

  general constraint that is satisfied by or

3 Output hypothesis h

### THEORY

the Find-S algorithm is a basic concept learning algorithm in ML. It is used to find the maximally specific hypothesis. Find-S starts with the most specific hypothesis and generalizes this hypothesis each time it fails to classify an observed positive example.

#### OUTPUT

```
PS C:\Users\DELL\Downloads> & "C:/Program Files/Python311/python.exe"
Data read from dataset.csv :
      Time Weather Temperature Company Humidity Wind Goes
0 Morning Sunny Warm Yes Mild Strong Yes
1 Evening Rainy Cold No Mild Normal No
                                       Normal Yes
                     Moderate
                                 Yes
2 Morning Sunny
                   Cold
                                Yes High Strong Yes
3 Evening Sunny
 Storing attributes in numpy array:
 [['Morning' 'Sunny' 'Warm' 'Yes' 'Mild' 'Strong']
 ['Evening' 'Rainy' 'Cold' 'No' 'Mild' 'Normal']
 ['Morning' 'Sunny' 'Moderate' 'Yes' 'Normal' 'Normal']
['Evening' 'Sunny' 'Cold' 'Yes' 'High' 'Strong']]
 Target = ['Yes', 'No', 'Yes', 'Yes']
 Final Hypothesis = ['?' 'Sunny' '?' 'Yes' '?' '?']
```

#### CODE

```
import pandas as pd
import numpy as np
data = pd.read csv ("ML Lab Files/dataset.csv")
print ( "In Data read from dataset.csv :InIn", data )
arr = np.array (data)
attributes = arr [:,:-1]
print ( "\n Storing attributes in numpy array :\n\n", attributes)
target = [x[-1] for x in arr]
print ( "\n Target = ", target )
for ind, val in enumerate (target):
  if val == "Yes":
     specific_hypothesis = attributes [ ind ].copy ()
for ind , val in enumerate ( attributes ) :
  if target [ ind ] == "Yes" :
     for el in range ( len ( specific_hypothesis ) ) :
        if val [ el ] != specific_hypothesis [ el ] :
          specific hypothesis [el] = '?'
print ( "\n Final Hypothesis = ", specific_hypothesis )
```

RESULT Hence, the Find-S algorithm has been implemented successfully

AIM To implement the Naive Bayes' classifier algorithm in Python

### ALGIDRITHM

\* Convert the given dataset into frequency tables

\* generate likelihood table by finding the probabilities of given features

\* Now, use Bayes' theorem to calculate the posterior probability

## THEORY

Naive Bayes algorithm is a supervised learning algorithm, which is based on Bayes' theorem and used for solving classification problems. It is a probabilistic classifier, which means it predicts on the basis of the probability of an object.

Bayes' theorem is used to determine the probability of a hypothesis depending on conditional probability. It is given as,

$$P(A|B) = \frac{P(B|A)P(A)}{P(B)}$$

# OUTPUT

1 Rainy Hot High True No 2 Overcast Hot High False Yes 3 Sunny Mild High False Yes 4 Sunny Cool Normal False Yes 5 Sunny Cool Normal True No 6 Overcast Cool Normal True Yes 7 Rainy Mild High False No 8 Rainy Cool Normal False Yes 9 Sunny Mild Normal False Yes 10 Rainy Mild Normal True Yes 11 Overcast Mild High True Yes 12 Overcast Hot Normal False Yes 13 Sunny Mild High True No  Numpy array = [['Rainy' 'Hot' 'High' False 'No'] ['Rainy' 'Hot' 'High' True 'No'] ['Sunny' 'Gool' 'Normal' False 'Yes'] ['Sunny' 'Cool' 'Normal' False 'Yes'] ['Sunny' 'Gool' 'Normal' True 'Yes'] ['Rainy' 'Mild' 'High' False 'Yes'] ['Rainy' 'Mild' 'High' False 'Yes'] ['Sunny' 'Mild' 'Normal' True 'Yes'] ['Rainy' 'Mild' 'Normal' False 'Yes'] ['Sunny' 'Mild' 'Normal' False 'Yes'] ['Overcast' 'Mild' 'High' True 'Yes'] ['Overcast' 'Hot' 'Normal' False 'Yes'] ['Sunny' 'Mild' 'High' True 'Yes']					
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9 Sunny Mild Normal False Yes 10 Rainy Mild Normal True Yes 11 Overcast Mild High True Yes 12 Overcast Hot Normal False Yes 13 Sunny Mild High True No  Numpy array = [['Rainy' 'Hot' 'High' False 'No'] ['Rainy' 'Hot' 'High' True 'No'] ['Overcast' 'Hot' 'High' False 'Yes'] ['Sunny' 'Cool' 'Normal' False 'Yes'] ['Sunny' 'Cool' 'Normal' True 'No'] ['Overcast' 'Cool' 'Normal' True 'Yes'] ['Rainy' 'Mild' 'High' False 'No'] ['Rainy' 'Mild' 'Normal' False 'Yes'] ['Sunny' 'Mild' 'Normal' False 'Yes'] ['Rainy' 'Mild' 'Normal' True 'Yes'] ['Overcast' 'Mild' 'High' True 'Yes'] ['Overcast' 'Hot' 'Normal' False 'Yes'] ['Sunny' 'Mild' 'High' True 'Yes'] ['Sunny' 'Mild' 'High' True 'Yes']	7 Rainy	Mild	High	False	No
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11 Overcast Mild High True Yes 12 Overcast Hot Normal False Yes 13 Sunny Mild High True No  Numpy array = [['Rainy' 'Hot' 'High' False 'No']  ['Rainy' 'Hot' 'High' True 'No']  ['Overcast' 'Hot' 'High' False 'Yes']  ['Sunny' 'Mild' 'High' False 'Yes']  ['Sunny' 'Cool' 'Normal' False 'Yes']  ['Sunny' 'Cool' 'Normal' True 'No']  ['Overcast' 'Cool' 'Normal' True 'Yes']  ['Rainy' 'Mild' 'High' False 'Yes']  ['Sunny' 'Mild' 'Normal' False 'Yes']  ['Sunny' 'Mild' 'Normal' True 'Yes']  ['Overcast' 'Mild' 'High' True 'Yes']  ['Overcast' 'Hot' 'Normal' False 'Yes']  ['Sunny' 'Mild' 'High' True 'No']]	9 Sunny	Mild	Normal	False	Yes
12 Overcast Hot Normal False Yes 13 Sunny Mild High True No  Numpy array = [['Rainy' 'Hot' 'High' False 'No']   ['Rainy' 'Hot' 'High' True 'No']   ['Overcast' 'Hot' 'High' False 'Yes']   ['Sunny' 'Mild' 'High' False 'Yes']   ['Sunny' 'Cool' 'Normal' False 'Yes']   ['Overcast' 'Cool' 'Normal' True 'No']   ['Overcast' 'Cool' 'Normal' True 'Yes']   ['Rainy' 'Mild' 'High' False 'Yes']   ['Sunny' 'Mild' 'Normal' False 'Yes']   ['Sunny' 'Mild' 'Normal' True 'Yes']   ['Overcast' 'Mild' 'High' True 'Yes']   ['Overcast' 'Hot' 'Normal' False 'Yes']   ['Sunny' 'Mild' 'High' True 'No']]	10 Rainy	Mild	Normal	True	Yes
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['Rainy' 'Hot' 'High' True 'No'] ['Overcast' 'Hot' 'High' False 'Yes'] ['Sunny' 'Cool' 'Normal' False 'Yes'] ['Sunny' 'Cool' 'Normal' True 'No'] ['Overcast' 'Cool' 'Normal' True 'Yes'] ['Rainy' 'Mild' 'High' False 'No'] ['Rainy' 'Cool' 'Normal' False 'Yes'] ['Sunny' 'Mild' 'Normal' False 'Yes'] ['Sunny' 'Mild' 'Normal' True 'Yes'] ['Overcast' 'Mild' 'High' True 'Yes'] ['Overcast' 'Hot' 'Normal' False 'Yes'] ['Sunny' 'Mild' 'High' True 'No']]	13 Sunny	Mild	High	True	No
[0.028218694885361547, 0.0] 1.0 > 0.0 => Result : Positive Sample !					

#### CODE

```
import pandas as pd
import numpy as np
data = pd.read csv ("ML Lab Files/nb_dataset.csv")
print ( "\n Data read from dataset.csv :\n\n", data )
arr = np.array (data)
print ( "\n Numpy array = ", arr)
X = arr[:,:-1]
y = arr[:, -1]
iters = [arr[:,x] for x in range(4)]
attr_labels = [ list ( set ( itr ) ) for itr in iters ]
def computeTable ( iters , attr_labels ) :
   matrix = []
   for itr, attr_label in zip (iters, attr_labels):
      mtx = { x : [ 0 for y in range (2)] for x in attr_label }
     for el in range (len (itr)):
        for lb in attr_label:
           if itr [ el ] == lb :
              if v [ el ] == "Yes" :
                mtx[lb][0] += 1
              else:
                mtx [ lb ] [ 1 ] += 1
      matrix.append ( mtx )
   return matrix
mtcs = computeTable ( iters , attr_labels )
targets = [0, 0]
 for el in y:
   if el == "Yes" :
      targets [0] += 1
   else:
      targets [ 1 ] += 1
 targets = [ target / sum ( targets ) for target in targets ]
 today = [ "Overcast", "Hot", "Normal", False ]
 def calcProbability ( matrix , target ):
   probs = [1,1]
   for ind in range (len (matrix)):
      countYes = matrix [ ind ] [ today [ ind ] ] [ 0 ]
      countNo = matrix [ ind ] [ today [ ind ] ] [ 1 ]
      totalYes = sum ( [ matrix [ ind ][ x ] [ 0 ] for x in matrix [ ind ] ] )
      totalNo = sum ([matrix[ind][x][1] for x in matrix[ind]])
      currProbs = [ countYes / totalYes , countNo / totalNo ]
      probs = [ prob * currProb for prob , currProb in zip ( probs , currProbs ) ]
   probs = [ prob * trg for prob , trg in zip ( probs , target ) ]
   return probs
```

```
result = calcProbability ( mtcs , targets )
print ( "\n", result )
resYes , resNo = result [ 0 ] / sum ( result ) , result [ 1 ] / sum ( result )
if resYes == resNo :
    print ( resYes , " = " , resNo , " => Result : Positive or Negative Sample !" )
elif resYes > resNo :
    print ( resYes , " > " , resNo , " => Result : Positive Sample !" )
else :
    print ( resYes , " < " , resNo , " => Result : Negative Sample !" )
```

Hence, the Naive Bayes algorithm has been implemented successfully