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LAB REPORT on

Machine Learning

Submitted by

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in partial fulfillment for the award of the degree of BACHELOR OF ENGINEERING
in
COMPUTER SCIENCE AND ENGINEERING



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CERTIFICATE

This is to certify that the Lab work entitled "Machine Learning" carried out by **Aruna Ravi K R** (1BM19CS225), who is bonafide student of **B. M. S. College of Engineering.** It is in partial fulfillment for the award of **Bachelor of Engineering in Computer Science and Engineering** of the Visvesvaraya Technological University, Belgaum during the year 2022. The Lab report has been approved as it satisfies the academic requirements in respect of a **Machine Learning** - (20CS6PCMAL) work prescribed for the said degree.

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Course Outcome

1) Implement and demonstrate the FIND-S algorithm for finding the most specific hypothesis based on a given set of training data samples.

```
In [14]: import numpy as np
           import pandas as pd
 In [15]: data = pd.read csv("finddata.csv")
           print(data,"\n")
                 Time Weather Temperature Company Humidity Goes
           0 Morning Sunny
                                     Warm Yes Mild Yes
           1 Evening Rainy Cold No Mild No
2 Morning Sunny Moderate Yes Normal Yes
3 Evening Sunny Cold Yes High Yes
 In [19]: d = np.array(data)[:,:-1]
           print("\n The attributes are: ",d)
           target = np.array(data)[:,-1]
           print("\n The target is: ",target)
            The attributes are: [['Morning' 'Sunny' 'Warm' 'Yes' 'Mild']
['Evening' 'Rainy' 'Cold' 'No' 'Mild']
['Morning' 'Sunny' 'Moderate' 'Yes' 'Normal']
            ['Evening' 'Sunny' 'Cold' 'Yes' 'High']]
            The target is: ['Yes' 'No' 'Yes' 'Yes']
In [17]: def findS(c,t):
                 for i, val in enumerate(t):
                      if val == "Yes":
                           specific hypothesis = c[i].copy()
                 for i, val in enumerate(c):
                      if t[i] == "Yes":
                           for x in range(len(specific_hypothesis)):
                                if val[x] != specific_hypothesis[x]:
                                     specific_hypothesis[x] = '?'
                                else:
                                     pass
                 return specific_hypothesis
In [18]: print("\n The final hypothesis is:",findS(d,target))
             The final hypothesis is: ['?' 'Sunny' '?' 'Yes' '?']
 In [ ]:
```

2) For a given set of training data examples stored in a .CSV file, implement and demonstrate the Candidate-Elimination algorithm to output a description of the set of all hypotheses consistent with the training examples

```
import numpy as np
In [4]:
        import pandas as pd
        #to read the data in the csv file
        data = pd.DataFrame(data=pd.read csv('enjoysport.csv'))
        print(data,"\n")
        #making an array of all the attributes
        concepts = np.array(data.iloc[:,0:-1])
        print("The attributes are: ",concepts)
        #segregating the target that has positive and negative examples
        target = np.array(data.iloc[:,-1])
        print("\n The target is: ",target)
        #training function to implement candidate elimination algorithm
        def learn(concepts, target):
         specific h = concepts[0].copy()
         print("\n Initialization of specific_h and general_h")
         print(specific h)
         general h = [["?" for i in range(len(specific h))] for i in
        range(len(specific h))]
         print(general h)
         for i, h in enumerate(concepts):
             if target[i] == "yes":
                 for x in range(len(specific h)):
                     if h[x]!= specific_h[x]:
                         specific_h[x] ='?'
                         general h[x][x] = '?'
                    # print(specific h)
             if target[i] == "no":
                 for x in range(len(specific h)):
                     if h[x]!= specific h[x]:
```

```
print(specific_h)
           print(general_h)
   indices = [i for i, val in enumerate(general_h) if val ==
['?', '?', '?', '?', '?']
for i in indices:
          general_h.remove(['?', '?', '?', '?', '?', '?'])
   return specific_h, general_h
s_final, g_final = learn(concepts, target)
   #obtaining the final hypothesis
   print("\nFinal Specific_h:", s_final, sep="\n")
print("\nFinal General_h:", g_final, sep="\n")
            sky temp humidity
                                              wind water forcast enjoysport
                               normaĺ strong warm
   0 sunny
                   warm
   1 sunny warm
                                  high strong warm
                                                                       same
                                                                                          yes
   2 rainy cold
                                  high strong warm change
                                                                                           no
   3 sunny warm
                                  high strong cool change
                                                                                          yes
   The attributes are: [['sunny' 'warm' 'normal' 'strong' 'warm' 'same']
['sunny' 'warm' 'high' 'strong' 'warm' 'same']
['rainy' 'cold' 'high' 'strong' 'warm' 'change']
['sunny' 'warm' 'high' 'strong' 'cool' 'change']]
     The target is: ['yes' 'yes' 'no' 'yes']
     Initialization of specific_h and general_h
   ['sunny' 'warm' 'normal' 'strong' 'warm' 'same']
[['?', '?', '?', '?', '?'], ['?', '?', '?', '?'], ['?', '?', '?', '?', '?'], ['?', '?', '?'], ['?', '?', '?'], ['?', '?', '?'], ['?', '?', '?'], ['?', '?', '?'], ['?', '?', '?']]
   Steps of Candidate Elimination Algorithm 1
['sunny' 'warm' 'normal' 'strong' 'warm' 'same']
[['?', '?', '?', '?', '?', '?'], ['?', '?', '?', '?'], ['?', '?', '?', '?', '?'], ['?', '?', '?', '?'], ['?', '?', '?', '?'], ['?', '?', '?', '?'], ['?', '?', '?', '?']]
Steps of Candidate Elimination Algorithm 1
['sunny' 'warm' 'normal' 'strong' 'warm' 'same']
[['?', '?', '?', '?', '?', '?'], ['?', '?', '?', '?'], ['?', '?', '?', '?'], ['?', '?', '?'], ['?', '?', '?'], ['?', '?', '?'], ['?', '?', '?'], ['?', '?', '?']]
  Steps of Candidate Elimination Algorithm 2
['sunny' 'warm' '?' 'strong' 'warm' 'same']
[['?', '?', '?', '?', '?', '?'], ['?', '?', '?', '?', '?'], ['?', '?', '?', '?', '?'], ['?', '?', '?', '?', '?'
'?'], ['?', '?', '?', '?', '?', '?'], ['?', '?', '?', '?', '?', '?']]
Steps of Candidate Elimination Algorithm 3
['sunny' 'warm' '?' 'strong' 'warm' 'same']
[['sunny', '?', '?', '?', '?', '?'], ['?', 'warm', '?', '?', '?'], ['?', '?', '?', '?', '?', '?'], ['?', '?', '?'], ['?', '?', '?'], ['?', '?', '?'], ['?', '?', '?', '?']
Steps of Candidate Elimination Algorithm 4
['sunny' 'warm' '?' 'strong' '?' '?']
[['sunny', '?', '?', '?', '?'], ['?', 'warm', '?', '?', '?'], ['?', '?', '?', '?', '?'], ['?', '?', '?'], ['?', '?', '?'], ['?', '?', '?'], ['?', '?', '?']
Final Specific_h:
['sunny' 'warm' '?' 'strong' '?' '?']
Final General_h:
[['sunny', '?', '?', '?', '?'], ['?', 'warm', '?', '?', '?', '?']]
```

3)Write a program to demonstrate the working of the decision tree based ID3 algorithm. Use an appropriate data set for building the decision tree and apply this knowledge to classify a new sample.

```
In [24]: import pandas as pd
                  import math
                  import numpy as np
      In [34]: data = pd.read_csv("data.csv")
                  features = [feat for feat in data]
                  features.remove("answer")
In [37]: class Node:
             def __init__(self):
                 self.children = []
self.value = ""
                 self.isLeaf = False
                 self.pred = ""
In [38]: def entropy(examples):
             pos = 0.0
             neg = 0.0
             for _, row in examples.iterrows():
                 if row["answer"] == "yes":
                    pos += 1
                 else:
                    neg += 1
             if pos == 0.0 or neg == 0.0:
                 return 0.0
                 p = pos / (pos + neg)
                 n = neg / (pos + neg)
                 return -(p * math.log(p, 2) + n * math.log(n, 2))
In [39]: def info_gain(examples, attr):
             uniq = np.unique(examples[attr])
             #print ("\n",uniq)
             gain = entropy(examples)
             #print ("\n",gain)
             for u in uniq:
                 subdata = examples[examples[attr] == u]
#print ("\n", subdata)
                 sub_e = entropy(subdata)
                 gain -= (float(len(subdata)) / float(len(examples))) * sub_e
                 #print ("\n",gain)
             return gain
```

```
In [40]: def ID3(examples, attrs):
             root = Node()
             max_gain = 0
             max_feat = ""
             gain = info_gain(examples, feature)
                 if gain > max_gain:
                     max_gain = gain
                     max_feat = feature
             root.value = max_feat
             #print ("\nMax feature attr", max_feat)
             uniq = np.unique(examples[max_feat])
             #print ("\n",uniq)
             for u in uniq:
                 #print ("\n",u)
                 subdata = examples[examples[max_feat] == u]
                 #print ("\n", subdata)
                 if entropy(subdata) == 0.0:
                     newNode = Node()
                     newNode.isLeaf = True
                     newNode.value = u
                     newNode.pred = np.unique(subdata["answer"])
                     root.children.append(newNode)
                 else:
                     dummyNode = Node()
                     dummyNode.value = u
                     new_attrs = attrs.copy()
                     new_attrs.remove(max_feat)
                     child = ID3(subdata, new_attrs)
                     dummyNode.children.append(child)
                     root.children.append(dummyNode)
             return root
 In [41]: def printTree(root: Node, depth=0):
                for i in range(depth):
                print("\t", end="")
print(root.value, end="")
                if root.isLeaf:
                    print(" -> ", root.pred)
                print()
                for child in root.children:
                    printTree(child, depth + 1)
 In [42]: root = ID3(data, features)
           printTree(root)
            outlook
                    overcast -> ['yes']
                    rain
                             wind
                                     strong -> ['no']
                                     weak -> ['yes']
                    sunny
                             humidity
                                     high -> ['no']
                                     normal -> ['yes']
```

4)Write a program to implement the naïve Bayesian classifier for a sample training data set stored as a .CSV file. Compute the accuracy of the classifier, considering few test data sets

```
In [1]:
            import numpy as np
             import pandas as pd
    In [2]: data = pd.read_csv('/content/dataset.csv')
            data.head()
    Out[2]:
                PlayTennis
                                                      Wind
                          Outlook Temperature Humidity
             0
                                                     Weak
                      No
                                                High
                            Sunny
                                         Hot
             1
                      No
                            Sunny
                                         Hot
                                                High Strong
                      Yes Overcast
                                         Hot
                                                High
                                                      Weak
             3
                      Yes
                             Rain
                                        Mild
                                                High
                                                     Weak
                      Yes
                             Rain
                                        Cool
                                              Normal
                                                     Weak
    In [3]: y = list(data['PlayTennis'].values)
            X = data.iloc[:,1:].values
            print(f'Target Values: {y}')
            print(f'Features: \n{X}')
In [4]: y \text{ train} = y[:8]
         y val = y[8:]
         X_{train} = X[:8]
         X \text{ val} = X[8:]
         print(f"Number of instances in training set: {len(X_train)}")
         print(f"Number of instances in testing set: {len(X val)}")
         Number of instances in training set: 8
         Number of instances in testing set: 6
```

```
In [5]: class NaiveBayesClassifier:
              def __init__(self, X, y):
                  self.X, self.y = X, y
                  self.N = len(self.X)
                  self.dim = len(self.X[0])
                  self.attrs = [[] for _ in range(self.dim)]
                  self.output_dom = {}
                  self.data = []
                  for i in range(len(self.X)):
                      for j in range(self.dim):
                           if not self.X[i][j] in self.attrs[j]:
                              self.attrs[j].append(self.X[i][j])
                      if not self.y[i] in self.output_dom.keys():
                           self.output_dom[self.y[i]] = 1
                      else:
                           self.output_dom[self.y[i]] += 1
                      self.data.append([self.X[i], self.y[i]])
              def classify(self, entry):
                  solve = None
                  max_arg = -1
                  for y in self.output dom.keys():
                      prob = self.output_dom[y]/self.N
                      for i in range(self.dim):
                           cases = [x for x in self.data if x[0][i] == entry[i] and x[1] == y]
                           n = len(cases)
                          prob *= n/self.N
                      if prob > max_arg:
                          max arg = prob
                           solve = y
                  return solve
In [6]: nbc = NaiveBayesClassifier(X_train, y_train)
         total_cases = len(y_val)
         good = 0
         bad = 0
         predictions = []
         for i in range(total_cases):
             predict = nbc.classify(X_val[i])
             predictions.append(predict)
             if y_val[i] == predict:
                 good += 1
             else:
                 bad += 1
         print('Predicted values:', predictions)
         print('Actual values:', y_val)
         print()
         print('Total number of testing instances in the dataset:', total_cases)
         print('Number of correct predictions:', good)
         print('Number of wrong predictions:', bad)
         print()
         print('Accuracy of Bayes Classifier:', good/total cases)
        Predicted values: ['No', 'Yes', 'No', 'Yes', 'Yes', 'No']
Actual values: ['Yes', 'Yes', 'Yes', 'Yes', 'No']
         Total number of testing instances in the dataset: 6
         Number of correct predictions: 4
         Number of wrong predictions: 2
         Accuracy of Bayes Classifier: 0.6666666666666666
```

5)Implement the Linear Regression algorithm in order to fit data points. Select appropriate data set for your experiment and draw graphs.

```
In [17]: import numpy as np
             import matplotlib.pyplot as plt
             import pandas as pd
             from sklearn.metrics import r2 score
     In [9]: dataset = pd.read_csv('salary_dataset.csv')
             X = dataset.iloc[:, :-1].values
y = dataset.iloc[:, 1].values
    In [10]: from sklearn.model_selection import train_test_split
             X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=1/3, random_state=0)
    In [11]: # Fitting Simple Linear Regression to the Training set
             from sklearn.linear_model import LinearRegression
             regressor = LinearRegression()
             regressor.fit(X_train, y_train)
    Out[11]: LinearRegression()
    In [15]: # Predicting the Test set results
             y_pred = regressor.predict(X_test)
    Out[15]: array([ 40835.10590871, 123079.39940819, 65134.55626083, 63265.36777221,
                   115602.64545369, 108125.8914992 , 116537.23969801, 76349.68719258, 100649.1375447 ])
                                                                  64199.96201652,
    In [18]: r2_score(y_test,y_pred)
    Out[18]: 0.9749154407708353
out[io].
             0.2742124407700222
In [19]: # Visualizing the Training set results
             viz_train = plt
             viz train.scatter(X train, y train, color='red')
             viz_train.plot(X_train, regressor.predict(X_train), color='blue')
             viz_train.title('Salary VS Experience (Training set)')
             viz train.xlabel('Year of Experience')
             viz_train.ylabel('Salary')
             viz train.show()
                                     Salary VS Experience (Training set)
                 120000
                 100000
                  80000
                   60000
                   40000
                                                                                 10
                                                                      8
                                                 Year of Experience
```

```
In [14]: # Visualizing the Test set results
    viz_test = plt
    viz_test.scatter(X_test, y_test, color='red')
    viz_test.plot(X_train, regressor.predict(X_train), color='blue')
    viz_test.title('Salary VS Experience (Test set)')
    viz_test.xlabel('Year of Experience')
    viz_test.ylabel('Salary')
    viz_test.show()
```

