

Q1

November 2, 2023

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[28]: from sklearn.preprocessing import OrdinalEncoder, OneHotEncoder
      from sklearn.ensemble import RandomForestClassifier, GradientBoostingClassifier
      from sklearn.model_selection import GridSearchCV
      import pandas as pd
      import numpy as np
      import statistics as stat
      from sklearn.datasets import load_iris
      from sklearn import tree
      from sklearn.metrics import accuracy_score
      import matplotlib.pyplot as plt
      import random
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[2]: label_encoder = None
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[3]: def get_np_array(file_name, encoding="onehot"):
      global label_encoder
      data = pd.read_csv(file_name)

      need_label_encoding = ['team', 'opp', 'host', 'month', 'day_match']
      # if(label_encoder is None):
      if encoding == "ordinal":
          label_encoder = OrdinalEncoder()
      else:
          label_encoder = OneHotEncoder(sparse_output = False)
          label_encoder.fit(data[need_label_encoding])
          data_1 = pd.DataFrame(label_encoder.transform(data[need_label_encoding]),
      ↪ columns = label_encoder.get_feature_names_out())

      #merge the two dataframes
      dont_need_label_encoding = ["year", "toss", "bat_first", "format",
      ↪, "fow", "score", "rpo", "result"]
      data_2 = data[dont_need_label_encoding]
      final_data = pd.concat([data_1, data_2], axis=1)

      X = final_data.iloc[:, :-1]
      y = final_data.iloc[:, -1:]
      return X.to_numpy(), y.to_numpy()
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[4]: class DTNode:
    def __init__(self, depth, my_id=None, is_leaf=False, value=0, data=None,
        ↪ columns=None, split_feature = None, split_feature_value = None, threshold =
        ↪ None):
        #To uniquely identify a node
        self.my_id = my_id

        self.depth = depth

        #add children afterwards
        self.children = []

        #if leaf
        self.is_leaf = is_leaf

        #It stores the majority y
        self.value = value

        #Below attributes makes sense for decision nodes (non leaf nodes)
        self.split_feature = split_feature
        self.split_feature_value = split_feature_value #only makes sense for
        ↪ categorical attributes. ex we want to move to children with weather="sunny"
        self.threshold = threshold #only makes sense for continouos attributes

        self.columns = columns
        self.data = data
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[5]: class DTree:
    def __init__(self, X_train, y_train, types):
        #Tree root should be DTNode
        self.root = None

        self.X_train = X_train
        self.y_train = y_train
        self.types = types

        self.id_counter = 0

        self.columns = [i for i in range(X_train.shape[1])]
        self.data = np.array([i for i in range(len(X_train))])

        #returns a dictionary with unique values and corresponding split
        def get_data_split(self, data, idx):
            data_split = dict()
            # print(data)
            X_temp = self.X_train[data]
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        if self.types[idx] == 'cat':
            unique_vals = np.unique(X_temp[:,idx])
            for val in unique_vals:
                indices = np.array([i for i, value in enumerate(X_temp[:,idx])
→ == val) if value])
                data_split[val] = data[indices]
            return data_split

        elif self.types[idx] == 'cont':
            median = stat.median(X_temp[:,idx])

            indices = np.array([i for i, value in enumerate(X_temp[:,idx]) <=
→ median) if value])
            if indices.shape[0] != 0:
                data_split["less_than_equal"] = data[indices]

            indices = np.array([i for i, value in enumerate(X_temp[:,idx]) >
→ median) if value])
            if indices.shape[0] != 0:
                data_split["more_than"] = data[indices]

            return data_split

    @staticmethod
    def compute_entropy(y, data):
        y_temp = y[data]
        unique_values, value_counts = np.unique(y_temp, return_counts=True)
        # print("unique values:", unique_values)
        # print("value counts:", value_counts)
        entropy = 0
        for val in value_counts:
            p = val/value_counts.sum()
            entropy += (-1)*p*np.log2(p)
        return entropy, unique_values[0]

    @staticmethod
    def compute_entropy_attr(X, y, data, col, col_type=None):
        entropy = 0
        X_temp = X[data]
        y_temp = y[data]
        S = len(data)
        # print("total:", S)
        # print(col, col_type)
        if col_type == 'cat':
            unique_vals = np.unique(X_temp[:,col])
            for val in unique_vals:
                S_val = np.count_nonzero(X_temp[:,col]==val)

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        entropy_temp,_ = DTree.compute_entropy(y_temp, X_temp[:
→,col]==val)
        # print(val, S_val, entropy_temp)
        entropy += (S_val/S)*entropy_temp
    elif col_type == 'cont':
        median = stat.median(X_temp[:,col])
        S_val1 = np.count_nonzero(X_temp[:,col] <= median)
        S_val2 = np.count_nonzero(X_temp[:,col] > median)
        entropy_temp1,_ = DTree.compute_entropy(y_temp, X_temp[:,col] <=
→median)
        entropy_temp2,_ = DTree.compute_entropy(y_temp, X_temp[:,col] >
→median)
        # print(S_val1, entropy_temp1)
        # print(S_val2, entropy_temp2)
        entropy = ((S_val1/S)*entropy_temp1)+((S_val2/S)*entropy_temp2)
    return entropy

def get_majority_y(self, data):
    y_temp = self.y_train[data]
    y_temp = y_temp.reshape(-1)
    return stat.mode(y_temp)

def build_tree(self, this_node=None, data = None, columns = None):
    # print(data)
    entropy, y_pred = DTree.compute_entropy(self.y_train, data)
    # print("entropy: ",entropy)
    #when entropy would be zero,only one type of y would be present, y_pred
→makes sense else no
    if entropy == 0:
        this_node.is_leaf = True
        this_node.value = y_pred

        #Updating ID
        if this_node.my_id == None:
            this_node.my_id = self.id_counter
            self.id_counter += 1
        return this_node
    else:
        if(len(columns) == 0):
            this_node.is_leaf = True
            this_node.value = self.get_majority_y(data)

            #Updating ID
            if this_node.my_id == None:
                this_node.my_id = self.id_counter
                self.id_counter += 1
            return this_node

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#Splitting criteria
entropy_cols = np.zeros(len(columns))
IG_cols = np.zeros(len(columns))
for i in range(len(columns)):
    entropy_cols[i] = DTTree.compute_entropy_attr(self.X_train,
↪self.y_train, self.data, columns[i], self.types[columns[i]])
    IG_cols[i] = entropy - entropy_cols[i]
    # print(columns[i],IG_cols[i])
#creating a node and returning
idx = columns[np.argmax(IG_cols)]

this_node.is_leaf = False
this_node.split_feature = idx
this_node.value = self.get_majority_y(data)
this_node.columns = columns
this_node.data = data

data_split = DTTree.get_data_split(self, data, idx)

if self.types[idx] == 'cat':
    # print(f"BUILD cat idx={idx}")
    for key,val in data_split.items():
        new_columns = columns.copy()

        new_columns.remove(idx)

        child_node = DTNode(depth = this_node.depth + 1, my_id =
↪self.id_counter, is_leaf=False, split_feature_value=key)
        self.id_counter += 1
        this_node.children.append(self.build_tree(child_node,
↪data=val, columns=new_columns))
    elif self.types[idx] == 'cont':
        # print(f"BUILD cont idx={idx}")
        if len(data_split) > 1:
            for key,val in data_split.items():
                X_temp = self.X_train[data]
                this_node.threshold = stat.median(X_temp[:,idx])
                child_node = DTNode(depth = this_node.depth + 1, my_id
↪
↪ self.id_counter, is_leaf=False, split_feature_value=key)
                self.id_counter += 1
                this_node.children.append(self.build_tree(child_node,
↪data=val, columns=columns))
        else:
            new_columns = columns.copy()

            new_columns.remove(idx)

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        for key, val in data_split.items():
            X_temp = self.X_train[data]
            this_node.threshold = stat.median(X_temp[:, idx])
            child_node = DTNode(depth = this_node.depth + 1, my_id=
↪ self.id_counter, is_leaf=False, split_feature_value=key)
            self.id_counter += 1
            this_node.children.append(self.build_tree(child_node,
↪ data=val, columns=new_columns))

        return this_node
        # print("Attribute to split: ", columns[idx])

    @staticmethod
    def print_node(root):
        if root.is_leaf:
            print(f"I am leaf and my value is {root.value} and my depth is
↪ {root.depth}")
        else:
            # print(f"I am not a leaf and i have {len(root.children)} and my
↪ value is {root.value} and my depth is {root.depth}")
            for child in root.children:
                # print(f"parent info:: split feature: {root.split_feature},
↪ split feature value: {root.split_feature_value}, threshold: {root.
↪ threshold}")
                # print(f"split feature: {child.split_feature}, split feature
↪ value: {child.split_feature_value}, threshold: {child.threshold}")
                DTree.print_node(child)

    def print_tree(self):
        DTree.print_node(self.root)

    def predict(self, X_test, max_depth):
        y_test_pred = np.zeros((len(X_test), 1))
        for index in range(len(X_test)):
            x = X_test[index]
            temp = self.root
            pred = None
            while(True):
                #Terminating condition
                if temp.is_leaf == True or temp.depth >= max_depth:
                    pred = temp.value
                    break

            split_feature = temp.split_feature
            type_split_feature = self.types[split_feature]

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        if type_split_feature == "cat":
            z = x[split_feature]
        else:
            if x[split_feature] <= temp.threshold:
                z = "less_than_equal"
            else:
                z = "more_than"

        flag = 0

        for child in temp.children:
            if child.split_feature_value == z:
                temp = child
                flag = 1

        #z not found in children, so return the prediction
        if flag == 0:
            pred = temp.value
            break

    y_test_pred[index][0] = pred

    return y_test_pred

def execute(self):
    this_node = DTNode(depth=0, my_id=0, is_leaf=False)
    self.id_counter += 1
    self.root = self.build_tree(this_node = this_node, data = self.data,
    ↪ columns = self.columns)
    print("Decision tree built successfully!")

```

Decision tree with both categorical attributes as well as continuous attributes (ordinal encoding)

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[6]: X_train,y_train = get_np_array('../Data/train.csv', encoding="ordinal")
    X_test, y_test = get_np_array("../Data/test.csv", encoding="ordinal")
    X_val, y_val = get_np_array("../Data/val.csv", encoding="ordinal")

    types = ['cat', 'cat', 'cat', "cat", "cat", "cont", "cat", "cat", "cat", "cont", "cont",
    ↪ "cont" ]

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[7]: dtree = DTTree(X_train,y_train, types)
    dtree.execute()

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Decision tree built successfully!

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[8]: dtree.print_tree()

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[9]: max_depth_list = [5,10,15,20,25]
      training_acc = []
      testing_acc = []

      for max_depth in max_depth_list:
          print("Max depth: ", max_depth)

          y_train_pred = dtree.predict(X_train, max_depth = max_depth)
          train_acc = accuracy_score(y_train, y_train_pred)
          print("training accuracy: ",train_acc)
          training_acc.append(train_acc)

          y_test_pred = dtree.predict(X_test, max_depth = max_depth)
          test_acc = accuracy_score(y_test, y_test_pred)
          print("testing accuracy: ",test_acc)
          testing_acc.append(test_acc)

          print("\n")
```

Max depth: 5
training accuracy: 0.8058004343937651
testing accuracy: 0.5842812823164426

Max depth: 10
training accuracy: 0.9753417656828925
testing accuracy: 0.5966907962771458

Max depth: 15
training accuracy: 0.9998722371278906
testing accuracy: 0.59358841778697

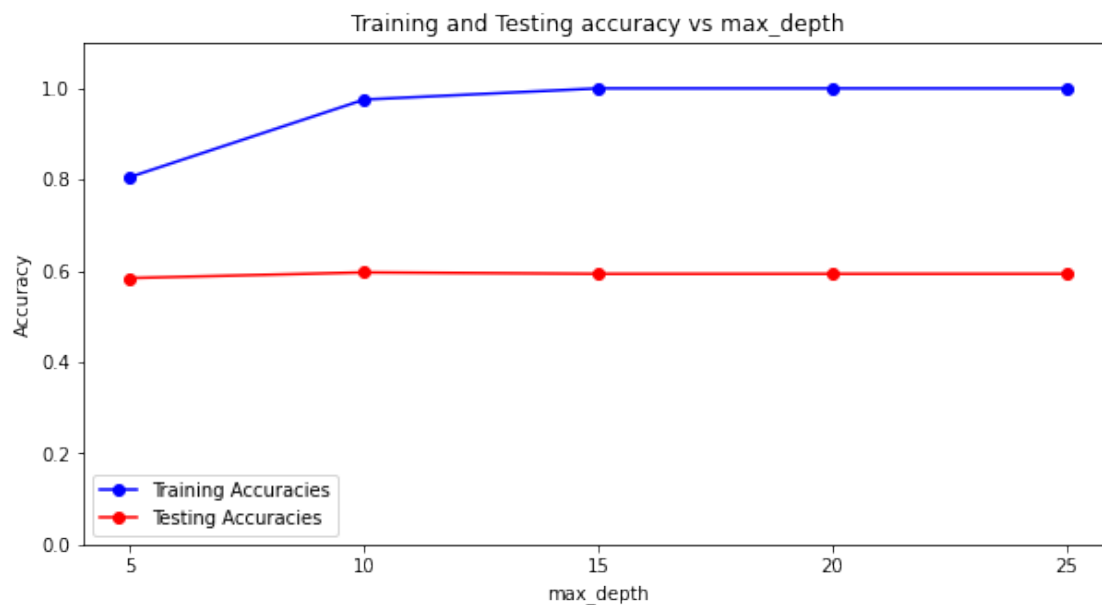
Max depth: 20

training accuracy: 0.9998722371278906
testing accuracy: 0.59358841778697

Max depth: 25
training accuracy: 0.9998722371278906
testing accuracy: 0.59358841778697

```
[10]: #Plot training and testing accuracies for different max_depth
plt.figure(figsize=(10,5))
plt.plot(max_depth_list, training_acc, marker='o', markersize=6, color='blue',
        label='Training Accuracies')
plt.plot(max_depth_list, testing_acc, marker='o', markersize=6, color='red',
        label='Testing Accuracies')

plt.title('Training and Testing accuracy vs max_depth')
plt.xlabel('max_depth')
plt.ylabel('Accuracy')
plt.xticks(max_depth_list)
plt.ylim(0,1.1)
plt.legend()
plt.show()
```



Only win prediction on test data

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```

```
[13]: # for idx in range(dtrees_1h.X_train.shape[1]):
#       unique_vals = np.unique(dtrees_1h.X_train[:,idx])
#       print(idx, len(unique_vals))
```

```
[14]: max_depth_list = [15,25,35,45,55,65,75]
training_acc = []
testing_acc = []

for max_depth in max_depth_list:
    print("Max depth: ", max_depth)

    y_train_pred = dtrees_1h.predict(X_train, max_depth = max_depth)
    train_acc = accuracy_score(y_train, y_train_pred)
    print("training accuracy: ",train_acc)
    training_acc.append(train_acc)

    y_test_pred = dtrees_1h.predict(X_test, max_depth = max_depth)
    test_acc = accuracy_score(y_test, y_test_pred)
    print("testing accuracy: ",test_acc)
    testing_acc.append(test_acc)

    print("\n")
```

```
Max depth: 15
training accuracy: 0.5935863038201099
testing accuracy: 0.5594622543950362
```

Max depth: 25
training accuracy: 0.6211830841957328
testing accuracy: 0.5791106514994829

Max depth: 35
training accuracy: 0.6443081640475278
testing accuracy: 0.5811789038262668

Max depth: 45
training accuracy: 0.7093394659511946
testing accuracy: 0.5966907962771458

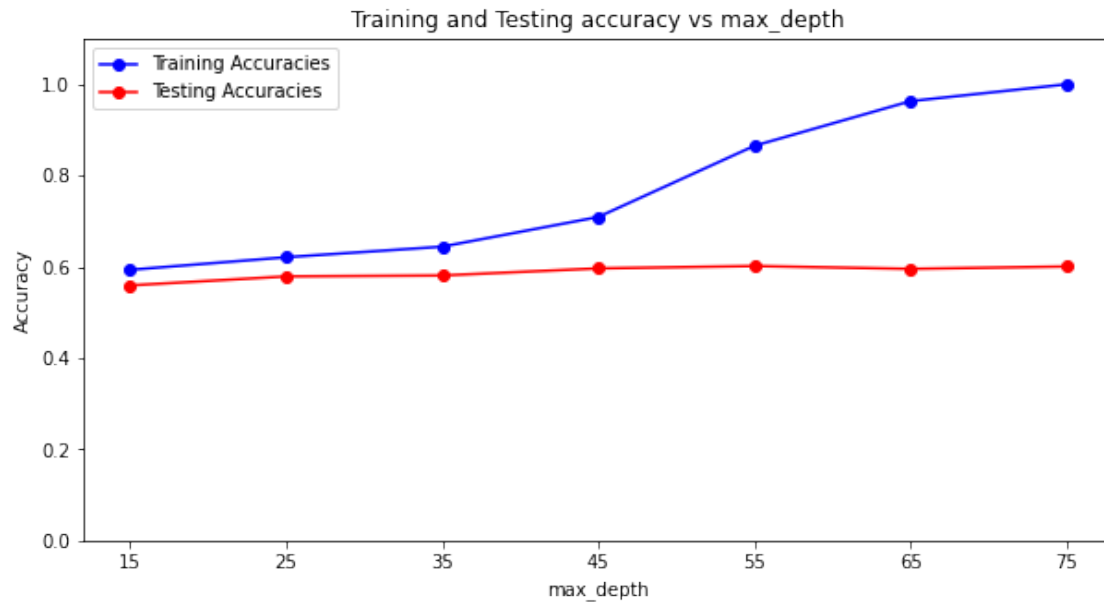
Max depth: 55
training accuracy: 0.8652101699246199
testing accuracy: 0.6018614270941055

Max depth: 65
training accuracy: 0.9630765299603935
testing accuracy: 0.5956566701137539

Max depth: 75
training accuracy: 1.0
testing accuracy: 0.6008273009307136

```
[15]: #Plot training and testing accuracies for different max_depth
plt.figure(figsize=(10,5))
plt.plot(max_depth_list, training_acc, marker='o', markersize=6, color='blue',
        ↪label='Training Accuracies')
plt.plot(max_depth_list, testing_acc, marker='o', markersize=6, color='red',
        ↪label='Testing Accuracies')

plt.title('Training and Testing accuracy vs max_depth')
plt.xlabel('max_depth')
plt.ylabel('Accuracy')
plt.xticks(max_depth_list)
plt.ylim(0,1.1)
plt.legend()
plt.show()
```



```
[47]: def count_nodes(root):
      if root.is_leaf == True:
          return 1
      count = 1
      for child in root.children:
          count += count_nodes(child)
      return count
```

```
[48]: # count_nodes(dtree.root)
```

```
[49]: count_nodes(dtree_1h.root)
```

```
[49]: 26753
```

Post pruning in decision tree

```
[120]: X_train, y_train = get_np_array('../Data/train.csv', encoding="onehot")
      X_test, y_test = get_np_array("../Data/test.csv", encoding="onehot")
      X_val, y_val = get_np_array("../Data/val.csv", encoding="onehot")
```

```
types = ['cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat',  
↳ 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat',  
↳ 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat',  
↳ 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat',  
↳ 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat',  
↳ 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat',  
↳ 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cat', 'cont', 'cat', 'cat', 'cat',  
↳ 'cat', 'cont', 'cont', 'cont']
```

```
[133]: #Dictionary to store the children info
children = dict()

#List of non leaf nodes
non_leaf_node_ids = []

#It stores the children dictionary and fills up the list of non_leaf_node_ids
→subject to max_depth
def store_children_info(root, max_depth):
    global children, non_leaf_node_ids
    if root.is_leaf == True or root.depth >= max_depth:
        a=1 #dummy statement
    else:
        non_leaf_node_ids.append(root.my_id)
        for child in root.children:
            children[root.my_id] = children[root.my_id] + [child.my_id]
            store_children_info(child, max_depth)

#It returns the list of all children, grand children, .. of idx with help of
→children dict
def return_all_childrens(children, idx):
    mega_lst = children[idx]
    for child in children[idx]:
        mega_lst = mega_lst + return_all_childrens(children, child)
    return mega_lst
```

```
[134]: def predict_new(root, types, X_test, y_test, non_leaf_considered_leaf,
↳max_depth):
    y_test_pred = np.zeros((len(X_test),1))
    for index in range(len(X_test)):
        x = X_test[index]
        temp = root
        pred = None
        while(True):
            #Terminating condition
            if temp.depth >= max_depth or (temp.is_leaf == True) or (temp.my_id_
↳in non_leaf_considered_leaf):
                pred = temp.value
```

```

        break

    split_feature = temp.split_feature
    type_split_feature = types[split_feature]

    if type_split_feature == "cat":
        z = x[split_feature]
    else:
        if x[split_feature] <= temp.threshold:
            z = "less_than_equal"
        else:
            z = "more_than"

    flag = 0

    for child in temp.children:
        if child.split_feature_value == z:
            temp = child
            flag = 1

    #z not found in children, so return the prediction
    if flag == 0:
        pred = temp.value
        break

    y_test_pred[index][0] = pred

acc = accuracy_score(y_test, y_test_pred)
return acc

def post_pruning(root, max_depth):
    no_non_leaf_nodes = []
    train_acc = []
    test_acc = []
    val_acc = []

    probab_pruning_when_no_improvement = 0.25

    global children, non_leaf_node_ids
    #Reinitializing the children dict
    children = dict()
    for i in range(count_nodes(dtree_1h.root)):
        children[i] = []

    #Reinitializing non leaf node ids
    non_leaf_node_ids = []

```

```

store_children_info(dtree_1h.root, max_depth)

v_acc = predict_new(root, types, X_val, y_val, non_leaf_considered_leaf =
↪ [], max_depth= max_depth)
tr_acc = predict_new(root, types, X_train, y_train,
↪ non_leaf_considered_leaf = [], max_depth= max_depth)
te_acc = predict_new(root, types, X_test, y_test, non_leaf_considered_leaf
↪= [], max_depth= max_depth)

no_non_leaf_nodes.append(len(non_leaf_node_ids))
train_acc.append(tr_acc)
test_acc.append(te_acc)
val_acc.append(v_acc)

print(f"Initial validation accuracy: {v_acc}")

random.shuffle(non_leaf_node_ids)

#Below code would store the non leaf which would be considered as leaf
↪based on validation accuracy
non_leaf_considered_leaf = []

while(len(non_leaf_node_ids) > 0):
    scores = np.zeros(len(non_leaf_node_ids))
    for i in range(len(non_leaf_node_ids)):
        scores[i] = predict_new(root, types, X_val, y_val,
↪ non_leaf_considered_leaf = non_leaf_considered_leaf +
↪ [non_leaf_node_ids[i]], max_depth= max_depth) - v_acc
    k = np.argmax(scores)
    curr_node = non_leaf_node_ids[k]
    if scores[k] < 0:
        break
    elif scores[k] == 0 and np.random.sample() <
↪ probab_pruning_when_no_improvement:
        break

    v_acc = v_acc + scores[k]
    tr_acc = predict_new(root, types, X_train, y_train,
↪ non_leaf_considered_leaf = non_leaf_considered_leaf + [curr_node],
↪ max_depth= max_depth)
    te_acc = predict_new(root, types, X_test, y_test,
↪ non_leaf_considered_leaf = non_leaf_considered_leaf + [curr_node],
↪ max_depth= max_depth)

    no_non_leaf_nodes.append(len(non_leaf_node_ids))

```



```

train_acc.append(tr_acc)
test_acc.append(te_acc)
val_acc.append(v_acc)

non_leaf_node_ids.remove(curr_node)
#update non_leaf_node_ids (in case when curr_node would be considered
↪leaf)
children_of_curr_node = return_all_children(children, curr_node)
non_leaf_node_ids = [item for item in non_leaf_node_ids if item not in
↪children_of_curr_node]
non_leaf_considered_leaf = non_leaf_considered_leaf + [curr_node]
print(f"Validation accuracy is {v_acc}. node with id:{curr_node} is now
↪a leaf node. unvisited_non_leaf_nodes:{len(non_leaf_node_ids)}")

#Training accuracy
print("Final Training accuracy: ",predict_new(root, types, X_train,
↪y_train, non_leaf_considered_leaf = non_leaf_considered_leaf, max_depth=
↪max_depth))

#Validation accuracy
print("Final Validation accuracy: ",predict_new(root, types, X_val, y_val,
↪non_leaf_considered_leaf = non_leaf_considered_leaf, max_depth= max_depth))

#Testing accuracy
print("Final Testing accuracy: ",predict_new(root, types, X_test, y_test,
↪non_leaf_considered_leaf = non_leaf_considered_leaf, max_depth= max_depth))

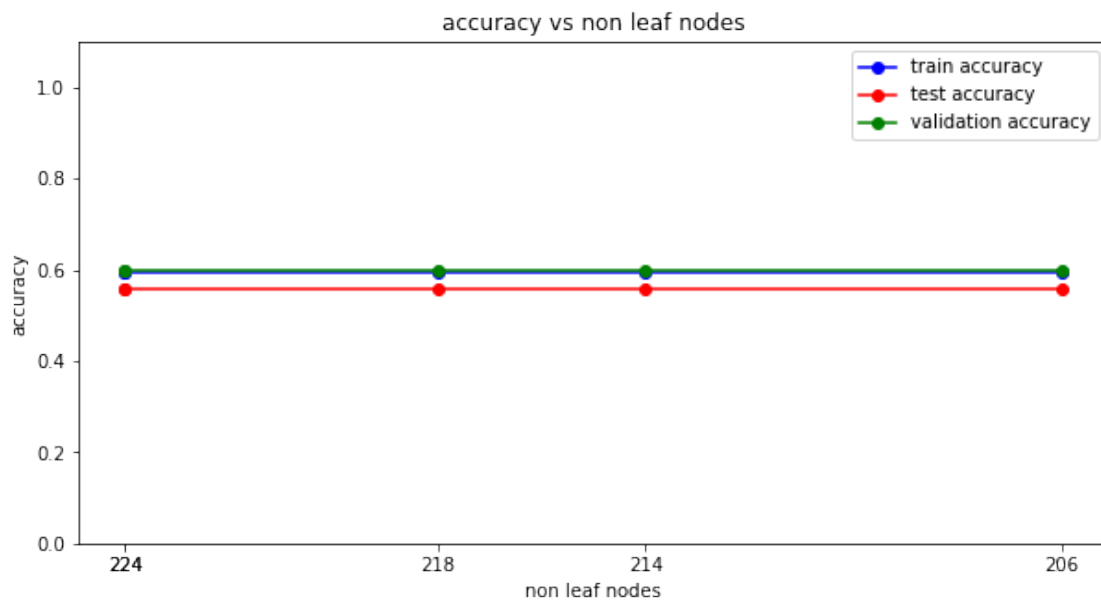
#Plot avg f1_scores for different depth
plt.figure(figsize=(10,5))
plt.plot(no_non_leaf_nodes, train_acc, marker='o', markersize=6,
↪color='blue', label='train accuracy')
plt.plot(no_non_leaf_nodes, test_acc, marker='o', markersize=6,
↪color='red', label='test accuracy')
plt.plot(no_non_leaf_nodes, val_acc, marker='o', markersize=6,
↪color='green', label='validation accuracy')

plt.title('accuracy vs non leaf nodes')
plt.xlabel('non leaf nodes')
plt.ylabel('accuracy')
plt.gca().invert_xaxis() # this line reverses the x-axis
plt.xticks(no_non_leaf_nodes)
plt.ylim(0,1.1)
plt.legend()
plt.show()

```

[135]: post_pruning(dtrees_1h.root, 15)

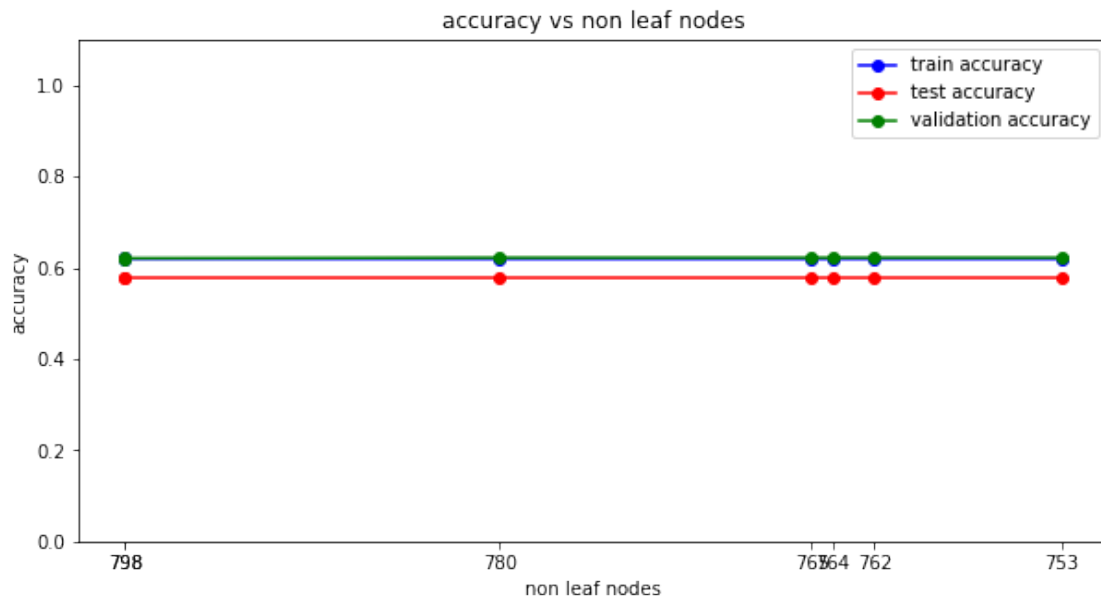
Initial validation accuracy: 0.596551724137931
 Validation accuracy is 0.596551724137931. node with id:12274 is now a leaf node.
 unvisited_non_leaf_nodes:218
 Validation accuracy is 0.596551724137931. node with id:23389 is now a leaf node.
 unvisited_non_leaf_nodes:214
 Validation accuracy is 0.596551724137931. node with id:24902 is now a leaf node.
 unvisited_non_leaf_nodes:206
 Validation accuracy is 0.596551724137931. node with id:16578 is now a leaf node.
 unvisited_non_leaf_nodes:205
 Final Training accuracy: 0.5934585409480005
 Final Validation accuracy: 0.596551724137931
 Final Testing accuracy: 0.5594622543950362



[136]: `post_pruning(dtree_1h.root, 25)`

Initial validation accuracy: 0.6183908045977011
 Validation accuracy is 0.6206896551724138. node with id:9341 is now a leaf node.
 unvisited_non_leaf_nodes:780
 Validation accuracy is 0.6218390804597701. node with id:25111 is now a leaf node.
 unvisited_non_leaf_nodes:765
 Validation accuracy is 0.6218390804597701. node with id:8247 is now a leaf node.
 unvisited_non_leaf_nodes:764
 Validation accuracy is 0.6218390804597701. node with id:6013 is now a leaf node.
 unvisited_non_leaf_nodes:762
 Validation accuracy is 0.6218390804597701. node with id:24484 is now a leaf node.
 unvisited_non_leaf_nodes:753
 Validation accuracy is 0.6218390804597701. node with id:23006 is now a leaf node.
 unvisited_non_leaf_nodes:749

Final Training accuracy: 0.6191388782419829
 Final Validation accuracy: 0.6218390804597701
 Final Testing accuracy: 0.578076525336091



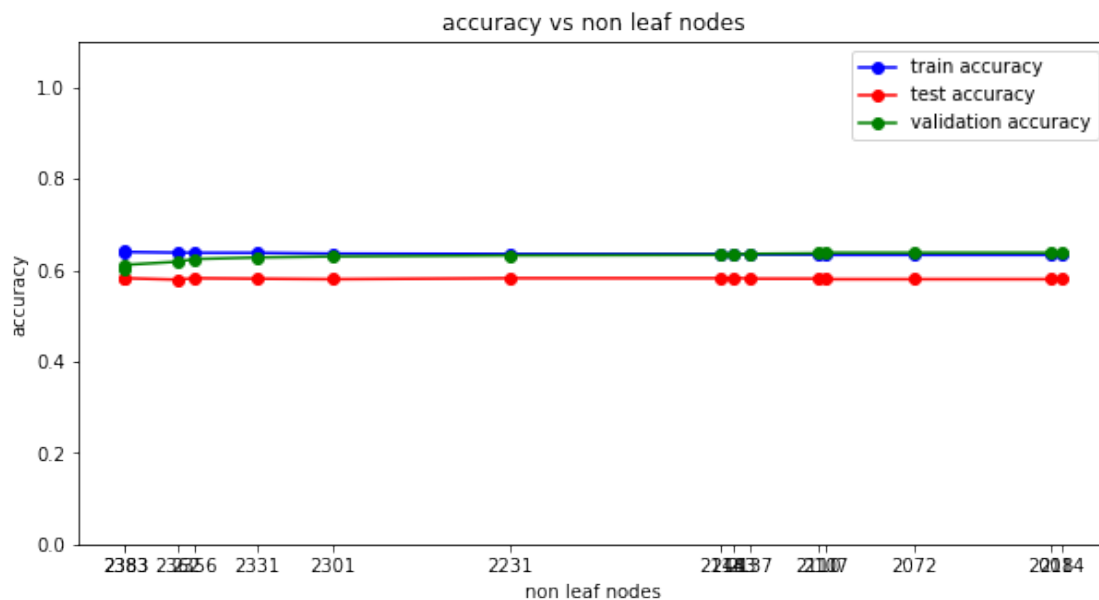
```
[137]: post_pruning(dtree_1h.root, 35)
```

Initial validation accuracy: 0.603448275862069
 Validation accuracy is 0.6114942528735632. node with id:4434 is now a leaf node.
 unvisited_non_leaf_nodes:2362
 Validation accuracy is 0.6183908045977011. node with id:6605 is now a leaf node.
 unvisited_non_leaf_nodes:2356
 Validation accuracy is 0.6241379310344828. node with id:22999 is now a leaf node.
 unvisited_non_leaf_nodes:2331
 Validation accuracy is 0.6275862068965518. node with id:16265 is now a leaf node.
 unvisited_non_leaf_nodes:2301
 Validation accuracy is 0.6298850574712643. node with id:9342 is now a leaf node.
 unvisited_non_leaf_nodes:2231
 Validation accuracy is 0.632183908045977. node with id:11563 is now a leaf node.
 unvisited_non_leaf_nodes:2148
 Validation accuracy is 0.6333333333333333. node with id:3907 is now a leaf node.
 unvisited_non_leaf_nodes:2143
 Validation accuracy is 0.6344827586206897. node with id:7926 is now a leaf node.
 unvisited_non_leaf_nodes:2137
 Validation accuracy is 0.635632183908046. node with id:4151 is now a leaf node.
 unvisited_non_leaf_nodes:2110
 Validation accuracy is 0.6367816091954023. node with id:33 is now a leaf node.
 unvisited_non_leaf_nodes:2107
 Validation accuracy is 0.6379310344827587. node with id:23400 is now a leaf node.

```

node. unvisited_non_leaf_nodes:2072
Validation accuracy is 0.6379310344827587. node with id:20753 is now a leaf
node. unvisited_non_leaf_nodes:2018
Validation accuracy is 0.6379310344827587. node with id:7770 is now a leaf node.
unvisited_non_leaf_nodes:2014
Validation accuracy is 0.6379310344827587. node with id:26653 is now a leaf
node. unvisited_non_leaf_nodes:1978
Final Training accuracy: 0.6331927941740131
Final Validation accuracy: 0.6379310344827587
Final Testing accuracy: 0.5801447776628749

```



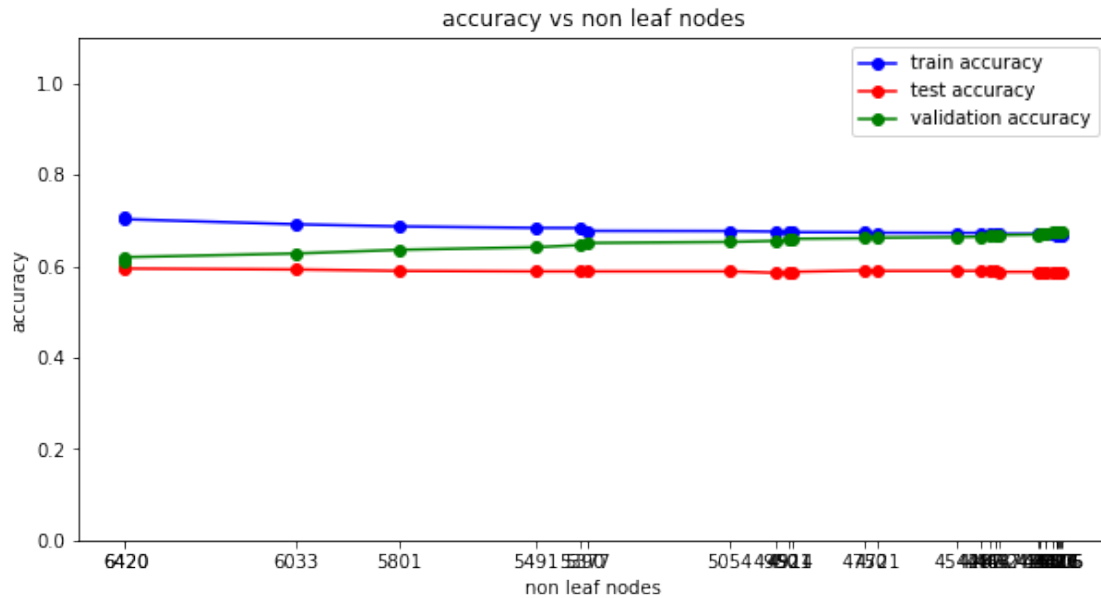
```
[138]: post_pruning(dtrees_1h.root, 45)
```

```

Initial validation accuracy: 0.6091954022988506
Validation accuracy is 0.6195402298850575. node with id:20741 is now a leaf
node. unvisited_non_leaf_nodes:6033
Validation accuracy is 0.6275862068965518. node with id:4426 is now a leaf node.
unvisited_non_leaf_nodes:5801
Validation accuracy is 0.635632183908046. node with id:15047 is now a leaf node.
unvisited_non_leaf_nodes:5491
Validation accuracy is 0.6413793103448275. node with id:31 is now a leaf node.
unvisited_non_leaf_nodes:5390
Validation accuracy is 0.6459770114942529. node with id:25954 is now a leaf
node. unvisited_non_leaf_nodes:5377
Validation accuracy is 0.6505747126436782. node with id:12637 is now a leaf
node. unvisited_non_leaf_nodes:5054
Validation accuracy is 0.6528735632183909. node with id:7756 is now a leaf node.
unvisited_non_leaf_nodes:4950

```

Validation accuracy is 0.6551724137931034. node with id:1178 is now a leaf node.
unvisited_non_leaf_nodes:4921
Validation accuracy is 0.6574712643678161. node with id:11166 is now a leaf
node. unvisited_non_leaf_nodes:4914
Validation accuracy is 0.6597701149425287. node with id:11562 is now a leaf
node. unvisited_non_leaf_nodes:4750
Validation accuracy is 0.6609195402298851. node with id:10783 is now a leaf
node. unvisited_non_leaf_nodes:4721
Validation accuracy is 0.6620689655172414. node with id:23399 is now a leaf
node. unvisited_non_leaf_nodes:4542
Validation accuracy is 0.6632183908045977. node with id:19524 is now a leaf
node. unvisited_non_leaf_nodes:4487
Validation accuracy is 0.664367816091954. node with id:26309 is now a leaf node.
unvisited_non_leaf_nodes:4468
Validation accuracy is 0.6655172413793103. node with id:10400 is now a leaf
node. unvisited_non_leaf_nodes:4452
Validation accuracy is 0.6666666666666666. node with id:1461 is now a leaf node.
unvisited_non_leaf_nodes:4447
Validation accuracy is 0.667816091954023. node with id:3695 is now a leaf node.
unvisited_non_leaf_nodes:4358
Validation accuracy is 0.6689655172413793. node with id:2349 is now a leaf node.
unvisited_non_leaf_nodes:4355
Validation accuracy is 0.6701149425287356. node with id:7450 is now a leaf node.
unvisited_non_leaf_nodes:4343
Validation accuracy is 0.671264367816092. node with id:2634 is now a leaf node.
unvisited_non_leaf_nodes:4342
Validation accuracy is 0.6724137931034483. node with id:6482 is now a leaf node.
unvisited_non_leaf_nodes:4323
Validation accuracy is 0.6735632183908046. node with id:6804 is now a leaf node.
unvisited_non_leaf_nodes:4317
Validation accuracy is 0.674712643678161. node with id:17438 is now a leaf node.
unvisited_non_leaf_nodes:4316
Validation accuracy is 0.6758620689655173. node with id:17116 is now a leaf
node. unvisited_non_leaf_nodes:4311
Validation accuracy is 0.6758620689655173. node with id:3635 is now a leaf node.
unvisited_non_leaf_nodes:4306
Validation accuracy is 0.6758620689655173. node with id:20311 is now a leaf
node. unvisited_non_leaf_nodes:4305
Validation accuracy is 0.6758620689655173. node with id:10760 is now a leaf
node. unvisited_non_leaf_nodes:4301
Final Training accuracy: 0.6681998211319791
Final Validation accuracy: 0.6758620689655173
Final Testing accuracy: 0.5853154084798345



0.0.1 Decision tree using scikit learn

```
[6]: X_train, y_train = get_np_array('../Data/train.csv', encoding="onehot")
      X_test, y_test = get_np_array("../Data/test.csv", encoding="onehot")
      X_val, y_val = get_np_array("../Data/val.csv", encoding="onehot")
```

Keeping criterion as entropy

```
[7]: clf = tree.DecisionTreeClassifier(criterion="entropy")
      clf = clf.fit(X_train, y_train)
```

```
[8]: y_train_pred = clf.predict(X_train)
      y_val_pred = clf.predict(X_val)
      print(f"Training accuracy: {accuracy_score(y_train, y_train_pred)}")
      print(f"Validation accuracy: {accuracy_score(y_val, y_val_pred)}")
```

Training accuracy: 1.0

Validation accuracy: 0.6183908045977011

(i) Varying the `max_depth = {15,25,35,45}` and reporting the train and test accuracies

```
[9]: max_depths = [15,25,35,45]
      train_accuracy = []
      test_accuracy = []
      for max_depth in max_depths:
          clf = tree.DecisionTreeClassifier(criterion="entropy", max_depth=max_depth)
          clf = clf.fit(X_train, y_train)
          y_train_pred = clf.predict(X_train)
```

```

y_val_pred = clf.predict(X_val)
y_test_pred = clf.predict(X_test)

train_acc = accuracy_score(y_train, y_train_pred)
test_acc = accuracy_score(y_test, y_test_pred)
print(f"max_depth used is {max_depth}")
print(f"Training accuracy: {train_acc}")
print(f"Validation accuracy: {accuracy_score(y_val, y_val_pred)}")
print(f"Testing accuracy: {test_acc}\n")
train_accuracy.append(train_acc)
test_accuracy.append(test_acc)

```

```

max_depth used is 15
Training accuracy: 0.7129168263702568
Validation accuracy: 0.5850574712643678
Testing accuracy: 0.6070320579110652

```

```

max_depth used is 25
Training accuracy: 0.854733614411652
Validation accuracy: 0.6126436781609196
Testing accuracy: 0.6411582213029989

```

```

max_depth used is 35
Training accuracy: 0.9442953877603169
Validation accuracy: 0.6091954022988506
Testing accuracy: 0.6535677352637022

```

```

max_depth used is 45
Training accuracy: 0.9950172479877347
Validation accuracy: 0.6275862068965518
Testing accuracy: 0.640124095139607

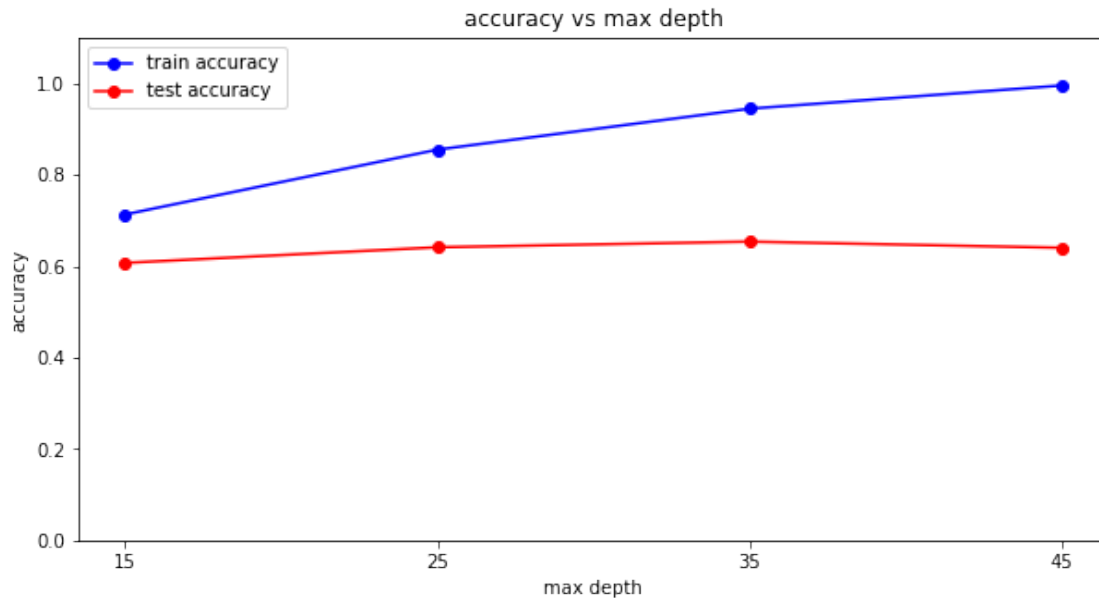
```

```

[11]: #Plot the train_acc and test_acc for various max depths
plt.figure(figsize=(10,5))
plt.plot(max_depths, train_accuracy, marker='o', markersize=6, color='blue',
        ↳label='train accuracy')
plt.plot(max_depths, test_accuracy, marker='o', markersize=6, color='red',
        ↳label='test accuracy')

plt.title('accuracy vs max depth')
plt.xlabel('max depth')
plt.ylabel('accuracy')
plt.xticks(max_depths)
plt.ylim(0,1.1)
plt.legend()
plt.show()

```



Running the decision tree on the best value of max_depth obtained using validation accuracy

```
[12]: clf = tree.DecisionTreeClassifier(criterion="entropy", max_depth=45)
      clf = clf.fit(X_train, y_train)
      y_train_pred = clf.predict(X_train)
      y_test_pred = clf.predict(X_test)
      print(f"max_depth used is 45")
      print(f"Training accuracy: {accuracy_score(y_train, y_train_pred)}")
      print(f"Testing accuracy: {accuracy_score(y_test, y_test_pred)}\n")
```

```
max_depth used is 45
Training accuracy: 0.9951450108598441
Testing accuracy: 0.6349534643226473
```

(ii) Varying the ccp_alpha = {0.001, 0.01, 0.1, 0.2} and reporting the train and test accuracies

```
[13]: ccp_alphas = [0.001, 0.01, 0.1, 0.2]
      train_accuracy = []
      test_accuracy = []
      for ccp_alpha in ccp_alphas:
          clf = tree.DecisionTreeClassifier(criterion="entropy", ccp_alpha=ccp_alpha)
          clf = clf.fit(X_train, y_train)
          y_train_pred = clf.predict(X_train)
          y_val_pred = clf.predict(X_val)
          y_test_pred = clf.predict(X_test)
```



```

train_acc = accuracy_score(y_train, y_train_pred)
test_acc = accuracy_score(y_test, y_test_pred)
print(f"ccp_alpha used is {ccp_alpha}")
print(f"Training accuracy: {train_acc}")
print(f"Validation accuracy: {accuracy_score(y_val, y_val_pred)}")
print(f"Testing accuracy: {test_acc}\n")
train_accuracy.append(train_acc)
test_accuracy.append(test_acc)

```

```

ccp_alpha used is 0.001
Training accuracy: 0.6894084579021337
Validation accuracy: 0.632183908045977
Testing accuracy: 0.6628748707342296

```

```

ccp_alpha used is 0.01
Training accuracy: 0.5344320940334739
Validation accuracy: 0.5
Testing accuracy: 0.5180972078593589

```

```

ccp_alpha used is 0.1
Training accuracy: 0.5033857161108982
Validation accuracy: 0.4735632183908046
Testing accuracy: 0.4963805584281282

```

```

ccp_alpha used is 0.2
Training accuracy: 0.5033857161108982
Validation accuracy: 0.4735632183908046
Testing accuracy: 0.4963805584281282

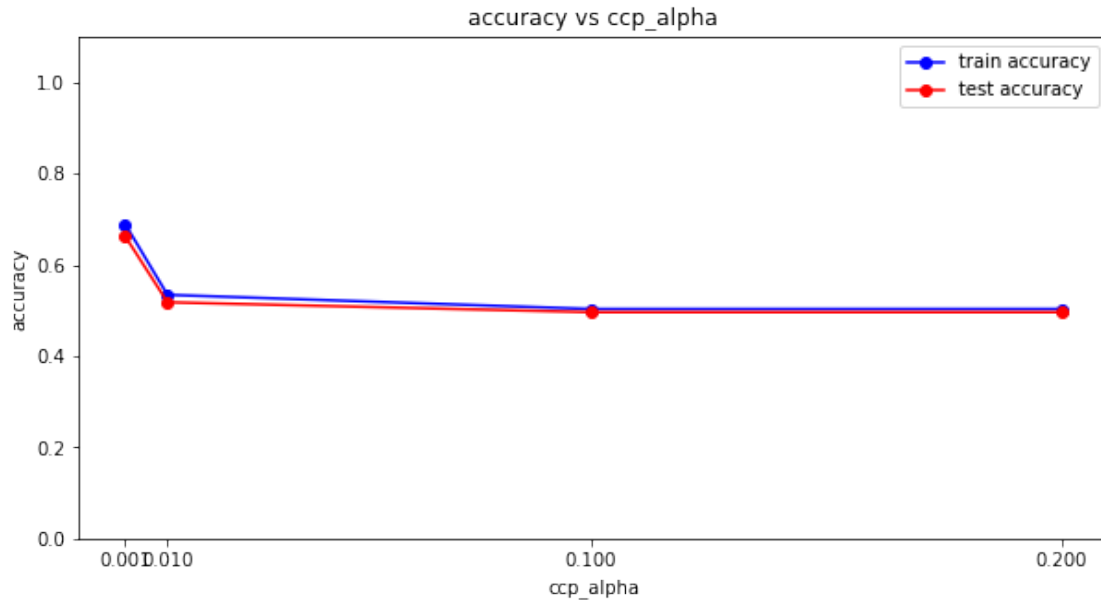
```

```

[14]: #Plot the train_acc and test_acc for various ccp_alphas
plt.figure(figsize=(10,5))
plt.plot(ccp_alphas, train_accuracy, marker='o', markersize=6, color='blue',
        ↪label='train accuracy')
plt.plot(ccp_alphas, test_accuracy, marker='o', markersize=6, color='red',
        ↪label='test accuracy')

plt.title('accuracy vs ccp_alpha')
plt.xlabel('ccp_alpha')
plt.ylabel('accuracy')
plt.xticks(ccp_alphas)
plt.ylim(0,1.1)
plt.legend()
plt.show()

```



Running the decision tree on the best value of `ccp_alpha` obtained using validation accuracy

```
[15]: clf = tree.DecisionTreeClassifier(criterion="entropy", ccp_alpha=0.001)
      clf = clf.fit(X_train, y_train)
      y_train_pred = clf.predict(X_train)
      y_val_pred = clf.predict(X_val)
      y_test_pred = clf.predict(X_test)
      print(f"ccp_alpha used is 0.001")
      print(f"Training accuracy: {accuracy_score(y_train, y_train_pred)}")
      print(f"Testing accuracy: {accuracy_score(y_test, y_test_pred)}\n")
```

ccp_alpha used is 0.001

Training accuracy: 0.6894084579021337

Testing accuracy: 0.6628748707342296

Random forests

```
[17]: X_train, y_train = get_np_array('../Data/train.csv', encoding="onehot")
      X_test, y_test = get_np_array("../Data/test.csv", encoding="onehot")
      X_val, y_val = get_np_array("../Data/val.csv", encoding="onehot")
```

```
[24]: best_oob_score_ = 0
      best_n_estimators = None
      best_max_features = None
      best_min_samples_split = None
```

```

for n_estimators in [50, 150, 250, 350]:
    for max_features in [0.1, 0.3, 0.5, 0.7, 0.9, 1.0]:
        for min_samples_split in [2, 4, 6, 8, 10]:
            print(f"Parameters->(n_estimators={n_estimators},
↳max_features={max_features}, min_samples_split={min_samples_split})")
            clf = RandomForestClassifier(n_estimators = n_estimators,
↳max_features=max_features, min_samples_split=min_samples_split,criterion =
↳"entropy", oob_score=True)
            clf.fit(X_train, y_train.ravel())
            y_val_pred = clf.predict(X_val)
            print(f"validation accuracy: {accuracy_score(y_val.ravel(),
↳y_val_pred)}")
            print("OOB(out of bag) accuracy: ",clf.oob_score_)
            print("\n")

            #update best
            if clf.oob_score_ > best_oob_score_:
                best_oob_score_ = clf.oob_score_
                best_n_estimators = n_estimators
                best_max_features = max_features
                best_min_samples_split = min_samples_split

```

```

Parameters->(n_estimators=50, max_features=0.1, min_samples_split=2)
validation accuracy: 0.6850574712643678
OOB(out of bag) accuracy: 0.6804650568544781

```

```

Parameters->(n_estimators=50, max_features=0.1, min_samples_split=4)
validation accuracy: 0.6793103448275862
OOB(out of bag) accuracy: 0.6794429538776031

```

```

Parameters->(n_estimators=50, max_features=0.1, min_samples_split=6)
validation accuracy: 0.6931034482758621
OOB(out of bag) accuracy: 0.6949022614028363

```

```

Parameters->(n_estimators=50, max_features=0.1, min_samples_split=8)
validation accuracy: 0.696551724137931
OOB(out of bag) accuracy: 0.691963715344321

```

```

Parameters->(n_estimators=50, max_features=0.1, min_samples_split=10)
validation accuracy: 0.6850574712643678
OOB(out of bag) accuracy: 0.6821259741918998

```

Parameters->(n_estimators=50, max_features=0.3, min_samples_split=2)
validation accuracy: 0.6885057471264368
OOB(out of bag) accuracy: 0.6927302925769772

Parameters->(n_estimators=50, max_features=0.3, min_samples_split=4)
validation accuracy: 0.6896551724137931
OOB(out of bag) accuracy: 0.6974575188450236

Parameters->(n_estimators=50, max_features=0.3, min_samples_split=6)
validation accuracy: 0.6827586206896552
OOB(out of bag) accuracy: 0.6914526638558834

Parameters->(n_estimators=50, max_features=0.3, min_samples_split=8)
validation accuracy: 0.7
OOB(out of bag) accuracy: 0.6984796218218986

Parameters->(n_estimators=50, max_features=0.3, min_samples_split=10)
validation accuracy: 0.696551724137931
OOB(out of bag) accuracy: 0.6982240960776799

Parameters->(n_estimators=50, max_features=0.5, min_samples_split=2)
validation accuracy: 0.6896551724137931
OOB(out of bag) accuracy: 0.6992461990545548

Parameters->(n_estimators=50, max_features=0.5, min_samples_split=4)
validation accuracy: 0.6931034482758621
OOB(out of bag) accuracy: 0.6924747668327584

Parameters->(n_estimators=50, max_features=0.5, min_samples_split=6)
validation accuracy: 0.6885057471264368
OOB(out of bag) accuracy: 0.6992461990545548

Parameters->(n_estimators=50, max_features=0.5, min_samples_split=8)
validation accuracy: 0.7068965517241379
OOB(out of bag) accuracy: 0.7052510540436949

Parameters->(n_estimators=50, max_features=0.5, min_samples_split=10)
validation accuracy: 0.6885057471264368
OOB(out of bag) accuracy: 0.7075507857416635

Parameters->(n_estimators=50, max_features=0.7, min_samples_split=2)
validation accuracy: 0.6816091954022988
OOB(out of bag) accuracy: 0.7007793535198671

Parameters->(n_estimators=50, max_features=0.7, min_samples_split=4)
validation accuracy: 0.6919540229885057
OOB(out of bag) accuracy: 0.700396064903539

Parameters->(n_estimators=50, max_features=0.7, min_samples_split=6)
validation accuracy: 0.6931034482758621
OOB(out of bag) accuracy: 0.7048677654273668

Parameters->(n_estimators=50, max_features=0.7, min_samples_split=8)
validation accuracy: 0.7034482758620689
OOB(out of bag) accuracy: 0.7141944550913505

Parameters->(n_estimators=50, max_features=0.7, min_samples_split=10)
validation accuracy: 0.7114942528735633
OOB(out of bag) accuracy: 0.7075507857416635

Parameters->(n_estimators=50, max_features=0.9, min_samples_split=2)
validation accuracy: 0.6954022988505747
OOB(out of bag) accuracy: 0.6996294876708828

Parameters->(n_estimators=50, max_features=0.9, min_samples_split=4)
validation accuracy: 0.6954022988505747
OOB(out of bag) accuracy: 0.7092117030790852

Parameters->(n_estimators=50, max_features=0.9, min_samples_split=6)
validation accuracy: 0.7022988505747126
OOB(out of bag) accuracy: 0.6996294876708828

Parameters->(n_estimators=50, max_features=0.9, min_samples_split=8)
validation accuracy: 0.7091954022988506
OOB(out of bag) accuracy: 0.7055065797879136

Parameters->(n_estimators=50, max_features=0.9, min_samples_split=10)

validation accuracy: 0.7091954022988506
OOB(out of bag) accuracy: 0.7076785486137729

Parameters->(n_estimators=50, max_features=1.0, min_samples_split=2)
validation accuracy: 0.7126436781609196
OOB(out of bag) accuracy: 0.7044844768110388

Parameters->(n_estimators=50, max_features=1.0, min_samples_split=4)
validation accuracy: 0.6977011494252874
OOB(out of bag) accuracy: 0.7006515906477577

Parameters->(n_estimators=50, max_features=1.0, min_samples_split=6)
validation accuracy: 0.6988505747126437
OOB(out of bag) accuracy: 0.700396064903539

Parameters->(n_estimators=50, max_features=1.0, min_samples_split=8)
validation accuracy: 0.7091954022988506
OOB(out of bag) accuracy: 0.7121502491376006

Parameters->(n_estimators=50, max_features=1.0, min_samples_split=10)
validation accuracy: 0.7045977011494253
OOB(out of bag) accuracy: 0.7079340743579916

Parameters->(n_estimators=150, max_features=0.1, min_samples_split=2)
validation accuracy: 0.6816091954022988
OOB(out of bag) accuracy: 0.6950300242749456

Parameters->(n_estimators=150, max_features=0.1, min_samples_split=4)
validation accuracy: 0.6908045977011494
OOB(out of bag) accuracy: 0.7018014564967421

Parameters->(n_estimators=150, max_features=0.1, min_samples_split=6)
validation accuracy: 0.6919540229885057
OOB(out of bag) accuracy: 0.7043567139389294

Parameters->(n_estimators=150, max_features=0.1, min_samples_split=8)
validation accuracy: 0.6977011494252874
OOB(out of bag) accuracy: 0.7055065797879136

Parameters->(n_estimators=150, max_features=0.1, min_samples_split=10)
validation accuracy: 0.6885057471264368
OOB(out of bag) accuracy: 0.7001405391593203

Parameters->(n_estimators=150, max_features=0.3, min_samples_split=2)
validation accuracy: 0.6908045977011494
OOB(out of bag) accuracy: 0.7018014564967421

Parameters->(n_estimators=150, max_features=0.3, min_samples_split=4)
validation accuracy: 0.7057471264367816
OOB(out of bag) accuracy: 0.7064009198926792

Parameters->(n_estimators=150, max_features=0.3, min_samples_split=6)
validation accuracy: 0.6954022988505747
OOB(out of bag) accuracy: 0.7102338060559601

Parameters->(n_estimators=150, max_features=0.3, min_samples_split=8)
validation accuracy: 0.6977011494252874
OOB(out of bag) accuracy: 0.7107448575443976

Parameters->(n_estimators=150, max_features=0.3, min_samples_split=10)
validation accuracy: 0.6954022988505747
OOB(out of bag) accuracy: 0.707423022869554

Parameters->(n_estimators=150, max_features=0.5, min_samples_split=2)
validation accuracy: 0.6770114942528735
OOB(out of bag) accuracy: 0.7141944550913505

Parameters->(n_estimators=150, max_features=0.5, min_samples_split=4)
validation accuracy: 0.6942528735632184
OOB(out of bag) accuracy: 0.7170052382777565

Parameters->(n_estimators=150, max_features=0.5, min_samples_split=6)
validation accuracy: 0.7057471264367816
OOB(out of bag) accuracy: 0.7102338060559601

Parameters->(n_estimators=150, max_features=0.5, min_samples_split=8)
validation accuracy: 0.6954022988505747

OOB(out of bag) accuracy: 0.7173885268940846

Parameters->(n_estimators=150, max_features=0.5, min_samples_split=10)
validation accuracy: 0.7022988505747126
OOB(out of bag) accuracy: 0.7129168263702568

Parameters->(n_estimators=150, max_features=0.7, min_samples_split=2)
validation accuracy: 0.696551724137931
OOB(out of bag) accuracy: 0.7106170946722883

Parameters->(n_estimators=150, max_features=0.7, min_samples_split=4)
validation accuracy: 0.6977011494252874
OOB(out of bag) accuracy: 0.7182828669988501

Parameters->(n_estimators=150, max_features=0.7, min_samples_split=6)
validation accuracy: 0.7034482758620689
OOB(out of bag) accuracy: 0.71227801200971

Parameters->(n_estimators=150, max_features=0.7, min_samples_split=8)
validation accuracy: 0.7011494252873564
OOB(out of bag) accuracy: 0.7154720838124441

Parameters->(n_estimators=150, max_features=0.7, min_samples_split=10)
validation accuracy: 0.7114942528735633
OOB(out of bag) accuracy: 0.7185383927430689

Parameters->(n_estimators=150, max_features=0.9, min_samples_split=2)
validation accuracy: 0.6896551724137931
OOB(out of bag) accuracy: 0.7141944550913505

Parameters->(n_estimators=150, max_features=0.9, min_samples_split=4)
validation accuracy: 0.7011494252873564
OOB(out of bag) accuracy: 0.7133001149865849

Parameters->(n_estimators=150, max_features=0.9, min_samples_split=6)
validation accuracy: 0.7
OOB(out of bag) accuracy: 0.7168774754056472

Parameters->(n_estimators=150, max_features=0.9, min_samples_split=8)
validation accuracy: 0.7
OOB(out of bag) accuracy: 0.723137856139006

Parameters->(n_estimators=150, max_features=0.9, min_samples_split=10)
validation accuracy: 0.7057471264367816
OOB(out of bag) accuracy: 0.7207103615689281

Parameters->(n_estimators=150, max_features=1.0, min_samples_split=2)
validation accuracy: 0.6988505747126437
OOB(out of bag) accuracy: 0.7173885268940846

Parameters->(n_estimators=150, max_features=1.0, min_samples_split=4)
validation accuracy: 0.6896551724137931
OOB(out of bag) accuracy: 0.7152165580682254

Parameters->(n_estimators=150, max_features=1.0, min_samples_split=6)
validation accuracy: 0.7114942528735633
OOB(out of bag) accuracy: 0.7191772071036157

Parameters->(n_estimators=150, max_features=1.0, min_samples_split=8)
validation accuracy: 0.7114942528735633
OOB(out of bag) accuracy: 0.7184106298709595

Parameters->(n_estimators=150, max_features=1.0, min_samples_split=10)
validation accuracy: 0.7034482758620689
OOB(out of bag) accuracy: 0.7239044333716622

Parameters->(n_estimators=250, max_features=0.1, min_samples_split=2)
validation accuracy: 0.6850574712643678
OOB(out of bag) accuracy: 0.6952855500191645

Parameters->(n_estimators=250, max_features=0.1, min_samples_split=4)
validation accuracy: 0.6781609195402298
OOB(out of bag) accuracy: 0.7002683020314296

Parameters->(n_estimators=250, max_features=0.1, min_samples_split=6)
validation accuracy: 0.6862068965517242
OOB(out of bag) accuracy: 0.7030790852178357

Parameters->(n_estimators=250, max_features=0.1, min_samples_split=8)
validation accuracy: 0.6919540229885057
OOB(out of bag) accuracy: 0.7079340743579916

Parameters->(n_estimators=250, max_features=0.1, min_samples_split=10)
validation accuracy: 0.6977011494252874
OOB(out of bag) accuracy: 0.7088284144627571

Parameters->(n_estimators=250, max_features=0.3, min_samples_split=2)
validation accuracy: 0.6827586206896552
OOB(out of bag) accuracy: 0.7145777437076786

Parameters->(n_estimators=250, max_features=0.3, min_samples_split=4)
validation accuracy: 0.7011494252873564
OOB(out of bag) accuracy: 0.7135556407308036

Parameters->(n_estimators=250, max_features=0.3, min_samples_split=6)
validation accuracy: 0.7011494252873564
OOB(out of bag) accuracy: 0.7124057748818193

Parameters->(n_estimators=250, max_features=0.3, min_samples_split=8)
validation accuracy: 0.7160919540229885
OOB(out of bag) accuracy: 0.71227801200971

Parameters->(n_estimators=250, max_features=0.3, min_samples_split=10)
validation accuracy: 0.6954022988505747
OOB(out of bag) accuracy: 0.7120224862654913

Parameters->(n_estimators=250, max_features=0.5, min_samples_split=2)
validation accuracy: 0.6942528735632184
OOB(out of bag) accuracy: 0.71227801200971

Parameters->(n_estimators=250, max_features=0.5, min_samples_split=4)
validation accuracy: 0.6954022988505747
OOB(out of bag) accuracy: 0.7180273412546314

Parameters->(n_estimators=250, max_features=0.5, min_samples_split=6)

validation accuracy: 0.7
OOB(out of bag) accuracy: 0.7208381244410375

Parameters->(n_estimators=250, max_features=0.5, min_samples_split=8)
validation accuracy: 0.7011494252873564
OOB(out of bag) accuracy: 0.7200715472083813

Parameters->(n_estimators=250, max_features=0.5, min_samples_split=10)
validation accuracy: 0.696551724137931
OOB(out of bag) accuracy: 0.7194327328478344

Parameters->(n_estimators=250, max_features=0.7, min_samples_split=2)
validation accuracy: 0.6977011494252874
OOB(out of bag) accuracy: 0.7158553724287722

Parameters->(n_estimators=250, max_features=0.7, min_samples_split=4)
validation accuracy: 0.696551724137931
OOB(out of bag) accuracy: 0.7157276095566628

Parameters->(n_estimators=250, max_features=0.7, min_samples_split=6)
validation accuracy: 0.7011494252873564
OOB(out of bag) accuracy: 0.717516289766194

Parameters->(n_estimators=250, max_features=0.7, min_samples_split=8)
validation accuracy: 0.7022988505747126
OOB(out of bag) accuracy: 0.7189216813593969

Parameters->(n_estimators=250, max_features=0.7, min_samples_split=10)
validation accuracy: 0.7022988505747126
OOB(out of bag) accuracy: 0.7187939184872876

Parameters->(n_estimators=250, max_features=0.9, min_samples_split=2)
validation accuracy: 0.6850574712643678
OOB(out of bag) accuracy: 0.7190494442315063

Parameters->(n_estimators=250, max_features=0.9, min_samples_split=4)
validation accuracy: 0.7011494252873564
OOB(out of bag) accuracy: 0.7172607640219753

Parameters->(n_estimators=250, max_features=0.9, min_samples_split=6)
validation accuracy: 0.7057471264367816
OOB(out of bag) accuracy: 0.7250542992206465

Parameters->(n_estimators=250, max_features=0.9, min_samples_split=8)
validation accuracy: 0.7
OOB(out of bag) accuracy: 0.7213491759294749

Parameters->(n_estimators=250, max_features=0.9, min_samples_split=10)
validation accuracy: 0.7011494252873564
OOB(out of bag) accuracy: 0.721732464545803

Parameters->(n_estimators=250, max_features=1.0, min_samples_split=2)
validation accuracy: 0.6862068965517242
OOB(out of bag) accuracy: 0.7177718155104127

Parameters->(n_estimators=250, max_features=1.0, min_samples_split=4)
validation accuracy: 0.7068965517241379
OOB(out of bag) accuracy: 0.7198160214641626

Parameters->(n_estimators=250, max_features=1.0, min_samples_split=6)
validation accuracy: 0.7045977011494253
OOB(out of bag) accuracy: 0.7195604957199437

Parameters->(n_estimators=250, max_features=1.0, min_samples_split=8)
validation accuracy: 0.7034482758620689
OOB(out of bag) accuracy: 0.7240321962437716

Parameters->(n_estimators=250, max_features=1.0, min_samples_split=10)
validation accuracy: 0.6988505747126437
OOB(out of bag) accuracy: 0.7258208764533026

Parameters->(n_estimators=350, max_features=0.1, min_samples_split=2)
validation accuracy: 0.6873563218390805
OOB(out of bag) accuracy: 0.6988629104382267

Parameters->(n_estimators=350, max_features=0.1, min_samples_split=4)
validation accuracy: 0.6827586206896552

OOB(out of bag) accuracy: 0.7030790852178357

Parameters->(n_estimators=350, max_features=0.1, min_samples_split=6)
validation accuracy: 0.6839080459770115
OOB(out of bag) accuracy: 0.7057621055321324

Parameters->(n_estimators=350, max_features=0.1, min_samples_split=8)
validation accuracy: 0.6919540229885057
OOB(out of bag) accuracy: 0.7099782803117414

Parameters->(n_estimators=350, max_features=0.1, min_samples_split=10)
validation accuracy: 0.7057471264367816
OOB(out of bag) accuracy: 0.7058898684042417

Parameters->(n_estimators=350, max_features=0.3, min_samples_split=2)
validation accuracy: 0.6942528735632184
OOB(out of bag) accuracy: 0.7120224862654913

Parameters->(n_estimators=350, max_features=0.3, min_samples_split=4)
validation accuracy: 0.6896551724137931
OOB(out of bag) accuracy: 0.7134278778586942

Parameters->(n_estimators=350, max_features=0.3, min_samples_split=6)
validation accuracy: 0.7011494252873564
OOB(out of bag) accuracy: 0.7163664239172096

Parameters->(n_estimators=350, max_features=0.3, min_samples_split=8)
validation accuracy: 0.6977011494252874
OOB(out of bag) accuracy: 0.7111281461607257

Parameters->(n_estimators=350, max_features=0.3, min_samples_split=10)
validation accuracy: 0.7045977011494253
OOB(out of bag) accuracy: 0.713683403602913

Parameters->(n_estimators=350, max_features=0.5, min_samples_split=2)
validation accuracy: 0.6908045977011494
OOB(out of bag) accuracy: 0.715088795196116

Parameters->(n_estimators=350, max_features=0.5, min_samples_split=4)
validation accuracy: 0.6942528735632184
OOB(out of bag) accuracy: 0.7189216813593969

Parameters->(n_estimators=350, max_features=0.5, min_samples_split=6)
validation accuracy: 0.6954022988505747
OOB(out of bag) accuracy: 0.7176440526383033

Parameters->(n_estimators=350, max_features=0.5, min_samples_split=8)
validation accuracy: 0.7011494252873564
OOB(out of bag) accuracy: 0.7203270729526

Parameters->(n_estimators=350, max_features=0.5, min_samples_split=10)
validation accuracy: 0.7068965517241379
OOB(out of bag) accuracy: 0.7186661556151782

Parameters->(n_estimators=350, max_features=0.7, min_samples_split=2)
validation accuracy: 0.6919540229885057
OOB(out of bag) accuracy: 0.7181551041267408

Parameters->(n_estimators=350, max_features=0.7, min_samples_split=4)
validation accuracy: 0.7011494252873564
OOB(out of bag) accuracy: 0.7173885268940846

Parameters->(n_estimators=350, max_features=0.7, min_samples_split=6)
validation accuracy: 0.7
OOB(out of bag) accuracy: 0.7212214130573655

Parameters->(n_estimators=350, max_features=0.7, min_samples_split=8)
validation accuracy: 0.7068965517241379
OOB(out of bag) accuracy: 0.7218602274179123

Parameters->(n_estimators=350, max_features=0.7, min_samples_split=10)
validation accuracy: 0.7011494252873564
OOB(out of bag) accuracy: 0.7209658873131468

Parameters->(n_estimators=350, max_features=0.9, min_samples_split=2)
validation accuracy: 0.6919540229885057
OOB(out of bag) accuracy: 0.7177718155104127

Parameters->(n_estimators=350, max_features=0.9, min_samples_split=4)
validation accuracy: 0.6977011494252874
OOB(out of bag) accuracy: 0.7205825986968187

Parameters->(n_estimators=350, max_features=0.9, min_samples_split=6)
validation accuracy: 0.6988505747126437
OOB(out of bag) accuracy: 0.7196882585920531

Parameters->(n_estimators=350, max_features=0.9, min_samples_split=8)
validation accuracy: 0.7034482758620689
OOB(out of bag) accuracy: 0.7222435160342404

Parameters->(n_estimators=350, max_features=0.9, min_samples_split=10)
validation accuracy: 0.696551724137931
OOB(out of bag) accuracy: 0.7221157531621311

Parameters->(n_estimators=350, max_features=1.0, min_samples_split=2)
validation accuracy: 0.6827586206896552
OOB(out of bag) accuracy: 0.717899578382522

Parameters->(n_estimators=350, max_features=1.0, min_samples_split=4)
validation accuracy: 0.7022988505747126
OOB(out of bag) accuracy: 0.7224990417784591

Parameters->(n_estimators=350, max_features=1.0, min_samples_split=6)
validation accuracy: 0.7034482758620689
OOB(out of bag) accuracy: 0.7216047016736936

Parameters->(n_estimators=350, max_features=1.0, min_samples_split=8)
validation accuracy: 0.6988505747126437
OOB(out of bag) accuracy: 0.7203270729526

Parameters->(n_estimators=350, max_features=1.0, min_samples_split=10)
validation accuracy: 0.6988505747126437
OOB(out of bag) accuracy: 0.7242877219879903

Running the random forest using optimal hyperparameters obtained based on OOB score

```
[25]: print("Optimal parameters based on OOB score:")
print(f"best_oob_score_{best_oob_score}")
print(f"best_n_estimators:{best_n_estimators}")
print(f"best_max_features:{best_max_features}")
print(f"best_min_samples_split:{best_min_samples_split}")

clf = RandomForestClassifier(n_estimators = best_n_estimators, max_features =
    ↳best_max_features, min_samples_split = best_min_samples_split, criterion =
    ↳"entropy", oob_score=True)
clf.fit(X_train, y_train.ravel())
y_train_pred = clf.predict(X_train)
y_val_pred = clf.predict(X_val)
y_test_pred = clf.predict(X_test)
print(f"Training accuracy: {accuracy_score(y_train.ravel(), y_train_pred)}")
print(f"Validation accuracy: {accuracy_score(y_val.ravel(), y_val_pred)}")
print(f"Testing accuracy: {accuracy_score(y_test.ravel(), y_test_pred)}")
print("OOB(out of bag) accuracy: ",clf.oob_score_)
```

```
Optimal parameters based on OOB score:
best_oob_score_:0.7258208764533026
best_n_estimators:250
best_max_features:1.0
best_min_samples_split:10
Training accuracy: 0.9814743835441421
Validation accuracy: 0.7045977011494253
Testing accuracy: 0.7249224405377456
OOB(out of bag) accuracy: 0.7199437843362719
```

Grid search to find optimal hyperparameters

```
[26]: #making the instance
model = RandomForestClassifier()

#Hyper Parameters Set
params = {
    'n_estimators': [50, 150, 250, 350],
    'max_features': [0.1, 0.3, 0.5, 0.7, 0.9, 1.0],
    'min_samples_split': [2, 4, 6, 8, 10],
    'criterion': ['entropy'],
    'oob_score': [True],
}

grid = GridSearchCV(estimator=model, param_grid=params, verbose=2)

# Fit the grid search to the data and find best hyperparameters
```



```
grid.fit(X_train, y_train.ravel())
```

Fitting 5 folds for each of 120 candidates, totalling 600 fits

```
[CV] END criterion=entropy, max_features=0.1, min_samples_split=2,
n_estimators=50, oob_score=True; total time= 0.4s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=2,
n_estimators=50, oob_score=True; total time= 0.4s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=2,
n_estimators=50, oob_score=True; total time= 0.4s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=2,
n_estimators=50, oob_score=True; total time= 0.4s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=2,
n_estimators=150, oob_score=True; total time= 1.4s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=2,
n_estimators=150, oob_score=True; total time= 1.3s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=2,
n_estimators=150, oob_score=True; total time= 1.3s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=2,
n_estimators=150, oob_score=True; total time= 1.3s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=2,
n_estimators=150, oob_score=True; total time= 1.4s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=2,
n_estimators=250, oob_score=True; total time= 2.2s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=2,
n_estimators=250, oob_score=True; total time= 2.1s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=2,
n_estimators=250, oob_score=True; total time= 2.1s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=2,
n_estimators=250, oob_score=True; total time= 2.1s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=2,
n_estimators=250, oob_score=True; total time= 2.1s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=2,
n_estimators=350, oob_score=True; total time= 3.0s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=2,
n_estimators=350, oob_score=True; total time= 3.0s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=2,
n_estimators=350, oob_score=True; total time= 3.0s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=2,
n_estimators=350, oob_score=True; total time= 3.0s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=2,
n_estimators=350, oob_score=True; total time= 3.0s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=4,
n_estimators=50, oob_score=True; total time= 0.4s
[CV] END criterion=entropy, max_features=0.1, min_samples_split=4,
n_estimators=50, oob_score=True; total time= 0.4s
```


[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]


```
[CV] END criterion=entropy, max_features=1.0, min_samples_split=10,
n_estimators=350, oob_score=True; total time= 13.8s
[CV] END criterion=entropy, max_features=1.0, min_samples_split=10,
n_estimators=350, oob_score=True; total time= 14.5s
```

```
[26]: GridSearchCV(estimator=RandomForestClassifier(),
                    param_grid={'criterion': ['entropy'],
                                'max_features': [0.1, 0.3, 0.5, 0.7, 0.9, 1.0],
                                'min_samples_split': [2, 4, 6, 8, 10],
                                'n_estimators': [50, 150, 250, 350],
                                'oob_score': [True]},
                    verbose=2)
```

Running the random forest with best hyperparameters obtained using grid search

```
[27]: # Best parameter after tuning
print("Best parameters: ",grid.best_params_)

# Store the best model for future use
model = grid.best_estimator_

model.fit(X_train, y_train.ravel())
y_train_pred = model.predict(X_train)
y_val_pred = model.predict(X_val)
y_test_pred = model.predict(X_test)
print(f"Training accuracy: {accuracy_score(y_train.ravel(), y_train_pred)}")
print(f"Validation accuracy: {accuracy_score(y_val.ravel(), y_val_pred)}")
print(f"Testing accuracy: {accuracy_score(y_test.ravel(), y_test_pred)}")
print("OOB(out of bag) accuracy: ",model.oob_score_)
```

```
Best parameters: {'criterion': 'entropy', 'max_features': 0.7,
'min_samples_split': 8, 'n_estimators': 350, 'oob_score': True}
Training accuracy: 0.9892679187428134
Validation accuracy: 0.7034482758620689
Testing accuracy: 0.7269906928645294
OOB(out of bag) accuracy: 0.7191772071036157
```

Gradient Boosting Classifier

```
[37]: X_train,y_train = get_np_array('../Data/train.csv', encoding="onehot")
X_test, y_test = get_np_array("../Data/test.csv", encoding="onehot")
X_val, y_val = get_np_array("../Data/val.csv", encoding="onehot")
```

Grid search to find optimal hyperparameters

```
[38]: #making the instance
model = GradientBoostingClassifier()

#Hyper Parameters Set
```

```

params = {
    'n_estimators': [50, 100, 150, 200, 250, 300],
    'learning_rate': [0.1, 0.5, 1.0],
    'min_samples_split': [6, 8, 10],
    'ccp_alpha': [0.0, 0.001, 0.005]
}

grid = GridSearchCV(estimator=model, param_grid=params, verbose=2)

# Fit the grid search to the data and find best hyperparameters
grid.fit(X_train, y_train.ravel())

```

```

Fitting 5 folds for each of 162 candidates, totalling 810 fits
[CV] END ccp_alpha=0.0, learning_rate=0.1, min_samples_split=6, n_estimators=50;
total time= 0.4s
[CV] END ccp_alpha=0.0, learning_rate=0.1, min_samples_split=6, n_estimators=50;
total time= 0.4s
[CV] END ccp_alpha=0.0, learning_rate=0.1, min_samples_split=6, n_estimators=50;
total time= 0.4s
[CV] END ccp_alpha=0.0, learning_rate=0.1, min_samples_split=6, n_estimators=50;
total time= 0.4s
[CV] END ccp_alpha=0.0, learning_rate=0.1, min_samples_split=6, n_estimators=50;
total time= 0.4s
[CV] END ccp_alpha=0.0, learning_rate=0.1, min_samples_split=6,
n_estimators=100; total time= 0.9s
[CV] END ccp_alpha=0.0, learning_rate=0.1, min_samples_split=6,
n_estimators=100; total time= 0.9s
[CV] END ccp_alpha=0.0, learning_rate=0.1, min_samples_split=6,
n_estimators=100; total time= 0.9s
[CV] END ccp_alpha=0.0, learning_rate=0.1, min_samples_split=6,
n_estimators=100; total time= 0.9s
[CV] END ccp_alpha=0.0, learning_rate=0.1, min_samples_split=6,
n_estimators=100; total time= 0.9s
[CV] END ccp_alpha=0.0, learning_rate=0.1, min_samples_split=6,
n_estimators=150; total time= 1.3s
[CV] END ccp_alpha=0.0, learning_rate=0.1, min_samples_split=6,
n_estimators=150; total time= 1.3s
[CV] END ccp_alpha=0.0, learning_rate=0.1, min_samples_split=6,
n_estimators=150; total time= 1.3s
[CV] END ccp_alpha=0.0, learning_rate=0.1, min_samples_split=6,
n_estimators=150; total time= 1.3s
[CV] END ccp_alpha=0.0, learning_rate=0.1, min_samples_split=6,
n_estimators=150; total time= 1.3s
[CV] END ccp_alpha=0.0, learning_rate=0.1, min_samples_split=6,
n_estimators=200; total time= 1.8s
[CV] END ccp_alpha=0.0, learning_rate=0.1, min_samples_split=6,
n_estimators=200; total time= 1.8s

```

[illegible]

[illegible]

[CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=8,
 n_estimators=200; total time= 1.8s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=8,
 n_estimators=200; total time= 1.9s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=8,
 n_estimators=200; total time= 2.0s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=8,
 n_estimators=250; total time= 2.5s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=8,
 n_estimators=250; total time= 2.5s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=8,
 n_estimators=250; total time= 2.8s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=8,
 n_estimators=250; total time= 3.2s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=8,
 n_estimators=250; total time= 2.7s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=8,
 n_estimators=300; total time= 3.3s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=8,
 n_estimators=300; total time= 3.0s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=8,
 n_estimators=300; total time= 3.1s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=8,
 n_estimators=300; total time= 2.8s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=8,
 n_estimators=300; total time= 3.0s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=10,
 n_estimators=50; total time= 0.5s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=10,
 n_estimators=50; total time= 0.5s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=10,
 n_estimators=50; total time= 0.5s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=10,
 n_estimators=50; total time= 0.5s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=10,
 n_estimators=50; total time= 0.5s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=10,
 n_estimators=100; total time= 1.0s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=10,
 n_estimators=100; total time= 1.0s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=10,
 n_estimators=100; total time= 1.0s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=10,
 n_estimators=100; total time= 1.0s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=10,
 n_estimators=100; total time= 0.9s
 [CV] END ccp_alpha=0.0, learning_rate=0.5, min_samples_split=10,
 n_estimators=150; total time= 1.5s


```
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=6,
n_estimators=300; total time= 2.7s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8, n_estimators=50;
total time= 0.4s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8, n_estimators=50;
total time= 0.4s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8, n_estimators=50;
total time= 0.4s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8, n_estimators=50;
total time= 0.4s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8, n_estimators=50;
total time= 0.5s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8,
n_estimators=100; total time= 0.9s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8,
n_estimators=100; total time= 1.0s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8,
n_estimators=100; total time= 1.1s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8,
n_estimators=100; total time= 0.9s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8,
n_estimators=100; total time= 0.9s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8,
n_estimators=150; total time= 1.4s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8,
n_estimators=150; total time= 1.3s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8,
n_estimators=150; total time= 1.4s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8,
n_estimators=150; total time= 1.5s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8,
n_estimators=150; total time= 1.4s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8,
n_estimators=200; total time= 1.8s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8,
n_estimators=200; total time= 1.8s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8,
n_estimators=200; total time= 1.8s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8,
n_estimators=200; total time= 1.8s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8,
n_estimators=250; total time= 2.2s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8,
n_estimators=250; total time= 2.2s
[CV] END ccp_alpha=0.0, learning_rate=1.0, min_samples_split=8,
n_estimators=250; total time= 2.3s
```


[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

```
[CV] END ccp_alpha=0.005, learning_rate=1.0, min_samples_split=10,  
n_estimators=300; total time= 2.6s
```

```
[38]: GridSearchCV(estimator=GradientBoostingClassifier(),  
                  param_grid={'ccp_alpha': [0.0, 0.001, 0.005],  
                              'learning_rate': [0.1, 0.5, 1.0],  
                              'min_samples_split': [6, 8, 10],  
                              'n_estimators': [50, 100, 150, 200, 250, 300]},  
                  verbose=2)
```

Running the Gradient boosting classifier with best hyperparameters obtained using grid search

```
[39]: # Best parameter after tuning  
print("Best parameters: ", grid.best_params_)  
  
# Store the best model for future use  
model = grid.best_estimator_  
  
model.fit(X_train, y_train.ravel())  
y_train_pred = model.predict(X_train)  
y_val_pred = model.predict(X_val)  
y_test_pred = model.predict(X_test)  
print(f"Training accuracy: {accuracy_score(y_train.ravel(), y_train_pred)}")  
print(f"Validation accuracy: {accuracy_score(y_val.ravel(), y_val_pred)}")  
print(f"Testing accuracy: {accuracy_score(y_test.ravel(), y_test_pred)}")
```

```
Best parameters: {'ccp_alpha': 0.0, 'learning_rate': 0.5, 'min_samples_split':  
10, 'n_estimators': 100}  
Training accuracy: 0.7926408585665006  
Validation accuracy: 0.732183908045977  
Testing accuracy: 0.7228541882109617
```

```
[ ]:
```