一、绘制一个棋盘和求解水仙花问题

```
6 import sys
 7
 8 for i in range(8):
       for j in range(8):
           if (i+j)%2 == 0:
10
11
                sys.stdout.write(chr(219))
12
                sys.stdout.write(chr(219))
13
           else:
                sys.stdout.write(' ')
14
       print (' ')
15
49 #水仙花问题
50 def jude(n):
     m=n
52
      a=int(m/100)
53
      m=m%100
54
      b=int(m/10)
55
     m=m%10
56
     if pow(m,3)+pow(a,3)+pow(b,3)==n:
57
          return True
58
      else:
59
          return False
60
61 for i in range(100,1000):
      if jude(i)==True and i!=407:
62
          print(i,end=',')
63
      elif i==407:
64
65
          print(i)
```

二、python 开发的学生信息管理系统

```
2 def showInfo():
4
        显示可以使用的功能列表给用户
     print("-"*30)
     print(" 学生管理系统
                          ")
7
     print(" 1.添加学生的信息")
9
     print(" 2. 删除学生的信息")
     print(" 3. 修改学生的信息")
10
     print(" 4. 查询学生的信息")
11
     print(" 5.遍历所有学生的信息")
12
     print(" 0.退出系统")
13
14
     print( '-'*30)
16#定义一个列表,用来存储多个学生的信息
17 students=[]
```

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```
20 def addStudent():
21
        添加一个学生,需要传入姓名、年龄、学号
22
23
     #输入学员姓名、年龄、学号
24
25
     stuName = input("请输入学生姓名: ")
     stuId = input("请输入学生学号(学号不可重复): ")
26
     stuAge = input("请输入学生年龄:")
27
28
     #验证学号是否唯一 #i 记录要删除的下标,Leap为标志位,如果找到Leap=1,否则为@
29
     i = 0
30
     leap = 0
31
     #循环判断
32
     for stu in students:
33
        if stu['stuId'] == stuId:
34
            leap = 1
35
            break
36
        else:
37
           i = i + 1
38
     #Leap == 1代表学生学号
39
     if leap == 1:
        print("输入学生学号重复,添加失败!")
40
41
     else:
42
        # 定义一个字典, 存放单个学生信息
        stuInfo = {}
43
        stuInfo['stuName'] = stuName
44
        stuInfo['stuId'] = stuId
45
46
        stuInfo['stuAge'] = stuAge
47
48
        # 单个学生信息放入列表
49
        students.append(stuInfo)
50
        print("添加成功!")
```

```
52#删除学生函数
53 def deleteStudent():
      根据学号删除学生, 学号
55
56
57
     print("您选择了删除学生功能")
     delId=input("请输入要删除的学生学号:")
58
59
     #i 记录要删除的下标,Leap为标志位,如果找到Leap=1,否则为0
60
     i = 0
61
     leap = 0
62
     for stu in students:
         if stu['stuId'] == delId:
63
64
            leap = 1
65
            break
66
         else:
67
            i=i+1
     if leap == 0:
68
69
        print("没有此学生学号, 删除失败!")
70
     else:
71
        del students[i]
         print("删除成功!")
72
```

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```
75 #修改学生函数, 有bug
 76 def updateStudent():
           根据学号修改学生信息, 学号
 78
 79
       print("您选择了修改学生信息功能")
 80
 81
       alterId=input("请输入你要修改学生的学号:")
       #检测是否有此学号,然后进行修改信息
 82
 83
       i = 0
 84
       leap = 0
 85
       for stu in students:
 86
           if stu['stuId'] == alterId:
 87
               leap = 1
 88
               break
 89
           else:
 90
               i = i + 1
 91
       if leap == 1:
 92
           updateOperate()
 93
       else:
           print("没有此学号,修改失败!")
 94
96 def updateOperate():
 97
         根据用户选择不同的操作来修改学生的信息
98
99
100
      while True:
         alterNum=int(input(" 1.修改学号\n 2.修改姓名 \n 3.修改年龄 \n 4.退出修改\n"))
101
102
         if alterNum == 1:
103
            newId=input("输入更改后的学号:")
104
            #修改后的学号要验证是否唯
105
            i = 0
106
            leap1 = 0
            for stu1 in students:
107
108
                if stu1['stuId'] == newId:
109
                   leap1 = 1
                   break
110
111
                else:
112
                   i = i + 1
            if leap1 == 1:
113
114
                print("输入学号不可重复,修改失败!")
115
            else:
                stu1['stuId']=newId
116
                print("学号修改成功")
117
                            #修改姓名操作
118
         elif alterNum == 2:
            newName=input("输入更改后的姓名:")
119
120
            stu['stuName'] = newName
121
            print("姓名修改成功")
122
            elif alterNum == 3:
                                     #修改年龄操作
123
                newAge=input("输入更改后的年龄:")
124
                stu['stuAge'] = newAge
125
                print("年龄修改成功")
            elif alterNum == 4:
126
127
                break
128
            else:
                print("输入错误请重新输入")
129
```

```
132#查询单个学生信息函数
133 def getStudentById():
134
        根据学号查询学生信息,需要传入学号
135
136
      print("您选择了查询学生信息功能")
137
      searchID=input("请输入你要查询学生的学号:")
138
139
      #验证是否有此学号
140
      i = 0
141
      leap = 0
142
      for stu in students:
143
         if stu['stuId'] == searchID:
144
            leap = 1
145
             break
146
         else:
147
            i = i + 1
      if leap == 0:
148
         print("没有此学生学号,查询失败!")
149
150
         print("找到此学生,信息如下:")
151
         print("学号: %s\n姓名: %s\n年龄: %s\n"%(stu['stuId'],stu['stuName'],stu['stuAge']))
152
154 #查询所有学生信息函数
155 def getAllStudent():
156
157
           查询所有学生信息
158
       #遍历并输出所有学生的信息
159
       print('*'*20)
       print("接下来进行遍历所有的学生信息...")
161
162
                       姓名
       print("stuId
163
       for stu in students:
164
          print("%s
                              %s"%(stu['stuId'],stu['stuName'],stu['stuAge']))
       print("*"*20)
165
167 #主函数
168 def main():
169
170
           主函数:程序的入口
171
       while True:
172
          #把功能列表进行显示给用户
173
174
          showInfo()
175
          #提示用户选择功能
176
          #获取用户选择的功能
177
178
           key = int(input("请选择功能(序号): "))
179
180
           #根据用户选择,完成相应功能
181
           if key == 1:
              addStudent()
182
183
           elif key == 2:
184
               deleteStudent()
185
           elif key == 3:
186
               updateStudent()
           elif key == 4:
187
           getStudentById()
elif key == 5:
188
189
               getAllStudent()
190
           elif key == 0:
191
              #退出功能,尽量往不退出的方向引
192
               quitconfirm = input("亲, 真的要退出么 (yes或者no)")
193
               if quitconfirm == 'yes':
print("欢迎使用本系统,谢谢")
194
195
196
                  break;1
197
           else:
               print("您输入有误,请重新输入")
198
199
200 main()
```

三、调用 sklearn 库和癌症数据集实现决策树

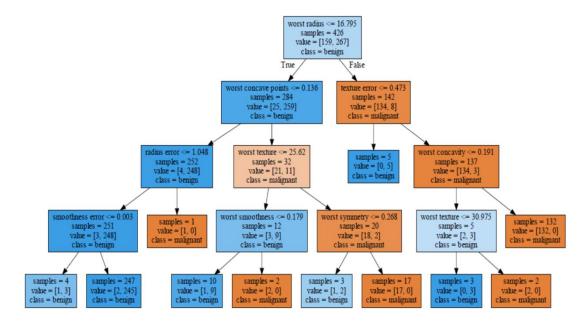
由于要使用 graphviz 函数,需要配置这个库,方法如下:

1) 打开 Anaconda Prompt 后, 输入 conda install graphviz, 然后再输入 pip install graphviz,

2) 将 graphviz 路径添加在系统环境变量中,如 D:\Anaconda3\Library\bin\graphviz.

```
6 from sklearn.tree import DecisionTreeClassifier
7 from sklearn.datasets import load_breast_cancer
8 from sklearn.model_selection import train_test_split
10 cancer =load_breast_cancer()
11 X_train, X_test, y_train, y_test = train_test_split(cancer.data,
12
                                                     cancer.target,
13
                                                     stratify=cancer.target,
14
                                                     random state=42)
15 tree = DecisionTreeClassifier(random state=0)
16 tree.fit(X_train,y_train)
17 print("Accuracy on training set:{:3f}".format(tree.score(X_train,y_train)))
18 print("Accuracy on testing set:{:3f}".format(tree.score(X_test,y_test)))
20 tree = DecisionTreeClassifier(max_depth=4,random_state=0)
21 tree.fit(X_train,y_train)
22 print("Accuracy on training set:{:.3f}".format(tree.score(X_train,y_train)))
23 print("Accuracy on testing set:{:.3f}".format(tree.score(X_test,y_test)))
24
25
26 from sklearn.tree import export graphviz
28 export_graphviz(tree,
                   out_file="tree.dot",
29
                   class_names=["malignant", "benign"],
30
31
                   feature_names=cancer.feature_names,
32
                   impurity=False,
33
                   filled=True)
34
35 import graphviz
36 with open("tree.dot") as f:
37
      dot_graph = f.read()
38
39 dot = graphviz.Source(dot_graph)
40 dot.view()
```

运行效果:

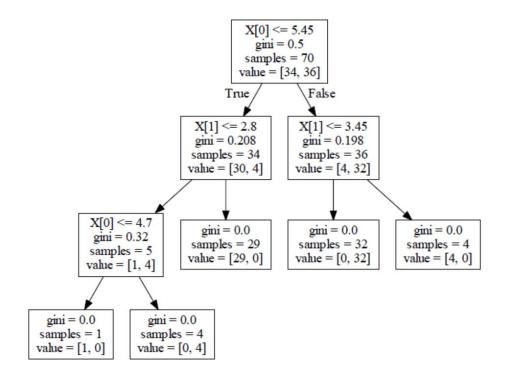


四、调用 sklearn 库和 iris 数据集实现决策树

```
6 import numpy as np
7 import pandas as pd
 8#import matplotlib.pyplot as plt
 9 from sklearn.datasets import load_iris
10 from sklearn.model_selection import train_test_split
11 from sklearn.tree import DecisionTreeClassifier
12 from sklearn.tree import export_graphviz
13 import graphviz
14
15 # data
16 def create_data():
17
       iris = load_iris()
18
       df = pd.DataFrame(iris.data, columns=iris.feature_names)
       df['label'] = iris.target
19
      df.columns = ['sepal length', 'sepal width', 'petal length', 'petal width', 'label']
data = np.array(df.iloc[:100, [0, 1, -1]])
20
21
22
      # print(data)
23
      return data[:,:2], data[:,-1]
24
25 X, y = create_data()
26 X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.3)
```

```
28 ' ' '
29 DecisionTreeClassifier(class_weight=None, criterion='gini', max_depth=None,
               max_features=None, max_leaf_nodes=None,
               min_impurity_decrease=0.0, min_impurity_split=None,
31
32
               min_samples_leaf=1, min_samples_split=2,
33
               min_weight_fraction_leaf=0.0, presort=False, random_state=None,
               splitter='best')
34
35 ' ' '
36 clf = DecisionTreeClassifier()
37 clf.fit(X_train, y_train,)
39 clf.score(X_test, y_test)
40
41 tree_pic = export_graphviz(clf, out_file="mytree.pdf")
42 with open('mytree.pdf') as f:
43
      dot_graph = f.read()
44
45 dot = graphviz.Source(dot_graph)
46 dot.view()
```

运行效果:



五、课本上的数据集

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```
6 import numpy as np
 7 import pandas as pd
 8 from math import log
 9 from sklearn.tree import export_graphviz
11 def create_data():
12
      datasets = [['青年','否','否','一般','否'],
                  ['青年','否','否','好','否'],
['青年','是','否','好','是'],
13
14
                  ['青年','是','是','一般','是'],
15
                  ['青年','否','否','一般','否'],
16
                  ['中年','否','否','一般','否'],
17
                  ['中年','否','否','好','否'],
18
                  ['中年', '是', '是', '好', '是'],
19
                  ['中年', '否', '是', '非常好', '是'],
20
                  ['中年', '否', '是', '非常好', '是'],
['老年', '否', '是', '非常好', '是'],
21
22
                  ['老年', '否', '是', '好', '是'],
['老年', '是', '否', '好', '是'],
23
24
                  ['老年','是','否','非常好','是'],
['老年','否','否','一般','否']]
25
26
27
      labels = [u'年龄', u'有工作', u'有自己的房子', u'信贷情况', u'类别']
28
      # 返回数据集和每个维度的名称
29
      return datasets, labels
30
31 datasets, labels = create_data()
33 train_data = pd.DataFrame(datasets, columns=labels)
35 #print (train_data)
37 # %商
38 def calc_ent(datasets):
      data_length = len(datasets)
40
      label_count = {}
41
      for i in range(data_length):
42
          label = datasets[i][-1]
          if label not in label_count:
43
44
              label_count[label] = 0
45
          label_count[label] += 1
46
      ent = -sum([(p/data_length)*log(p/data_length, 2) for p in label_count.values()])
47
      return ent
49# 经验条件熵
50 def cond_ent(datasets, axis=0):
51
      data_length = len(datasets)
52
      feature_sets = {}
53
      for i in range(data_length):
54
          feature = datasets[i][axis]
55
          if feature not in feature_sets:
56
              feature_sets[feature] = []
57
          feature_sets[feature].append(datasets[i])
      cond_ent = sum([(len(p)/data_length)*calc_ent(p) for p in feature_sets.values()])
58
59
      return cond_ent
```

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```
61# 信息增益
 62 def info_gain(ent, cond_ent):
        return ent - cond_ent
 64
 65 def info_gain_train(datasets):
 66
        count = len(datasets[0]) - 1
 67
        ent = calc_ent(datasets)
 68
        best_feature = []
 69
        for c in range(count):
            c_info_gain = info_gain(ent, cond_ent(datasets, axis=c))
 70
 71
            best_feature.append((c, c_info_gain))
 72
            print('特征({}) - info_gain - {:.3f}'.format(labels[c], c_info_gain))
 73
        # 比较大小
 74
        best_ = max(best_feature, key=lambda x: x[-1])
        return '特征({})的信息增益最大,选择为根节点特征'.format(labels[best_[0]])
 75
 76
 77 info_gain_train(np.array(datasets))
80# 定义节点类 二叉树
81 class Node:
     def __init__(self, root=True, label=None, feature_name=None, feature=None):
82
83
          self.root = root
84
          self.label = label
          self.feature_name = feature_name
85
86
          self.feature = feature
          self.tree = {}
          self.result = {'label:': self.label, 'feature': self.feature, 'tree': self.tree}
88
89
     def __repr__(self):
          return '{}'.format(self.result)
91
92
     def add_node(self, val, node):
93
94
          self.tree[val] = node
95
      def predict(self, features):
97
          if self.root is True:
              return self.label
98
          return self.tree[features[self.feature]].predict(features)
100
101 class DTree:
102
        def __init__(self, epsilon=0.1):
103
            self.epsilon = epsilon
            self._tree = {}
 104
105
 106
 107
        @staticmethod
 108
        def calc ent(datasets):
 109
            data_length = len(datasets)
 110
            label_count = {}
 111
            for i in range(data_length):
112
                label = datasets[i][-1]
113
                if label not in label_count:
 114
                    label_count[label] = 0
115
                label_count[label] += 1
            ent = -sum([(p/data_length)*log(p/data_length, 2) for p in label_count.values()])
 116
            return ent
117
119
       # 经验条件熵
120
       def cond_ent(self, datasets, axis=0):
121
           data_length = len(datasets)
122
           feature_sets = {}
123
           for i in range(data_length):
124
               feature = datasets[i][axis]
               if feature not in feature_sets:
125
126
                   feature_sets[feature] = []
127
               feature_sets[feature].append(datasets[i])
128
           cond_ent = sum([(len(p)/data_length)*self.calc_ent(p) for p in feature_sets.values()])
129
           return cond_ent
```

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```
131
         # 信息增益
132
         @staticmethod
133
         def info_gain(ent, cond_ent):
134
              return ent - cond_ent
135
136
         def info_gain_train(self, datasets):
137
              count = len(datasets[0]) - 1
138
              ent = self.calc_ent(datasets)
139
              best_feature = []
140
              for c in range(count):
                   c_info_gain = self.info_gain(ent, self.cond_ent(datasets, axis=c))
141
142
                   best_feature.append((c, c_info_gain))
143
144
              best_ = max(best_feature, key=lambda x: x[-1])
145
              return best_
147
       def train(self, train_data):
148
149
           input:数据集D(DataFrame格式),特征集A,阈值eta
150
           output:决策树T """
           _, y_train, features = train_data.iloc[:, :-1], train_data.iloc[:, -1], train_data.columns[:-1]
151
152
           # 1,若D中实例属于同一类Ck,则T为单节点树,并将类Ck作为结点的类标记,返回T
153
           if len(y_train.value_counts()) == 1:
154
              return Node(root=True,
155
                         label=y_train.iloc[0])
156
157
          # 2, 若A为空,则T为单节点树,将D中实例树最大的类Ck作为该节点的类标记,返回T
158
          if len(features) == 0:
159
              return Node(root=True, label=y_train.value_counts().sort_values(ascending=False).index[0])
169
           # 3, 计算最大信息增益 同5.1, Ag为信息增益最大的特征
161
162
          max_feature, max_info_gain = self.info_gain_train(np.array(train_data))
163
          max_feature_name = features[max_feature]
164
164
          # 4,Ag的信息增益小于阈值eta,则置T为单节点树,并将D中是实例数最大的类Ck作为该节点的类标记,返回T
165
166
          if max_info_gain < self.epsilon:</pre>
167
             return Node(root=True, label=y_train.value_counts().sort_values(ascending=False).index[0])
168
          # 5, 构建Ag子集
169
170
          node_tree = Node(root=False, feature_name=max_feature_name, feature=max_feature)
171
172
          feature_list = train_data[max_feature_name].value_counts().index
173
          for f in feature_list:
             sub_train_df = train_data.loc[train_data[max_feature_name] == f].drop([max_feature_name], axis=1)
174
175
             # 6. 递归生成树
176
             sub_tree = self.train(sub_train_df)
177
178
             node_tree.add_node(f, sub_tree)
179
          # pprint.pprint(node_tree.tree)
180
          return node tree
181
```

```
def fit(self, train_data):
183
           self._tree = self.train(train_data)
184
185
           return self._tree
186
187
     def predict(self, X_test):
188
           return self._tree.predict(X_test)
189
190 datasets, labels = create_data()
191 data_df = pd.DataFrame(datasets, columns=labels)
192 dt = DTree()
193 tree = dt.fit(data_df)
194 print (tree)
195
196 print (dt.predict(['老年', '否', '否', '一般']))
```