In [1]: import numpy as np import pandas as pd #Importing Data In [5]: crop=pd.read\_csv(r'D:\Ddownloads\RegisterLogin\croprecommendation dataset\Crop\_r In [7]: crop Out[7]: Ν P temperature humidity rainfall label K ph 0 90 42 43 20.879744 82.002744 6.502985 202.935536 rice 1 58 41 21.770462 80.319644 7.038096 226.655537 85 rice 2 55 23.004459 82.320763 7.840207 263.964248 60 44 rice 3 35 26.491096 80.158363 6.980401 242.864034 74 40 rice 4 78 42 42 20.130175 81.604873 7.628473 262.717340 rice 2195 107 34 32 26.774637 66.413269 6.780064 177.774507 coffee 2196 99 15 27 27.417112 56.636362 6.086922 127.924610 coffee **2197** 118 33 30 24.131797 67.225123 6.362608 173.322839 coffee 2198 117 32 34 26.272418 52.127394 6.758793 127.175293 coffee **2199** 104 18 30 23.603016 60.396475 6.779833 140.937041 coffee 2200 rows × 8 columns In [9]: crop.head() Out[9]: label Ν P Κ temperature humidity ph rainfall 90 42 43 20.879744 82.002744 6.502985 202.935536 rice 85 58 41 21.770462 80.319644 7.038096 226.655537 rice 60 55 44 23.004459 82.320763 7.840207 263.964248 rice 74 35 40 26.491096 80.158363 6.980401 242.864034 rice 78 42 42 20.130175 81.604873 7.628473 262.717340 rice

localhost:8889/doc/tree/croprecommendationsystem.ipynb?

crop.shape

(2200, 8)

crop.info()

In [13]:

Out[13]:

In [17]:

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 2200 entries, 0 to 2199

```
Data columns (total 8 columns):
             Column
                          Non-Null Count Dtype
                           _____
                           2200 non-null
         0
             N
                                           int64
         1
             Р
                          2200 non-null int64
         2
                          2200 non-null int64
             temperature 2200 non-null float64
         3
         4
             humidity
                           2200 non-null float64
         5
                           2200 non-null float64
             ph
             rainfall
                          2200 non-null float64
         6
         7
                           2200 non-null
             label
                                           object
        dtypes: float64(4), int64(3), object(1)
        memory usage: 137.6+ KB
In [19]: crop.isnull().sum()
Out[19]: N
                         0
                         0
                         0
          temperature
                         0
          humidity
                         0
          ph
          rainfall
                         0
          label
                         0
          dtype: int64
In [21]:
         crop.duplicated().sum()
Out[21]:
In [23]:
         crop.describe()
Out[23]:
                          Ν
                                      P
                                                   K temperature
                                                                     humidity
                                                                                        ph
          count 2200.000000
                             2200.000000 2200.000000
                                                                               2200.000000
                                                      2200.000000
                                                                   2200.000000
                   50.551818
                               53.362727
                                           48.149091
                                                        25.616244
                                                                     71.481779
                                                                                  6.469480
          mean
            std
                   36.917334
                               32.985883
                                            50.647931
                                                          5.063749
                                                                     22.263812
                                                                                  0.773938
           min
                    0.000000
                                5.000000
                                             5.000000
                                                         8.825675
                                                                     14.258040
                                                                                  3.504752
           25%
                   21.000000
                               28.000000
                                            20.000000
                                                        22.769375
                                                                     60.261953
                                                                                  5.971693
           50%
                   37.000000
                               51.000000
                                            32.000000
                                                        25.598693
                                                                     80.473146
                                                                                  6.425045
           75%
                   84.250000
                               68.000000
                                           49.000000
                                                        28.561654
                                                                     89.948771
                                                                                  6.923643
                  140.000000
                              145.000000
                                           205.000000
                                                        43.675493
                                                                     99.981876
                                                                                  9.935091
           max
In [35]:
         crop = pd.DataFrame(crop)
In [39]:
           #exploring Data
          print(crop.dtypes)
```

```
Ν
                          int64
        Ρ
                          int64
        Κ
                          int64
        temperature
                        float64
        humidity
                        float64
        ph
                        float64
                        float64
        rainfall
        label
                         object
        dtype: object
In [53]: df_numeric = df.select_dtypes(include=['number'])
          corr = df numeric.corr()
          print(corr)
                                                     temperature
                                                                   humidity
        Ν
                      1.000000 -0.231460 -0.140512
                                                         0.026504
                                                                   0.190688 0.096683
                     -0.231460 1.000000
                                           0.736232
                                                        -0.127541 -0.118734 -0.138019
        K
                     -0.140512 0.736232 1.000000
                                                        -0.160387 0.190859 -0.169503
        temperature 0.026504 -0.127541 -0.160387
                                                         1.000000 0.205320 -0.017795
        humidity
                      0.190688 -0.118734 0.190859
                                                         0.205320 1.000000 -0.008483
                      0.096683 -0.138019 -0.169503
        ph
                                                        -0.017795 -0.008483 1.000000
        rainfall
                      0.059020 -0.063839 -0.053461
                                                        -0.030084 0.094423 -0.109069
                     -0.031130 -0.491006 -0.346417
        label
                                                        0.113606 0.193911 -0.012253
                      rainfall
                                    label
        Ν
                      0.059020 -0.031130
        Р
                     -0.063839 -0.491006
                     -0.053461 -0.346417
        temperature -0.030084 0.113606
                      0.094423 0.193911
        humidity
        ph
                     -0.109069 -0.012253
        rainfall
                      1.000000 0.045611
        label
                      0.045611 1.000000
In [55]: from sklearn.preprocessing import LabelEncoder
          encoder = LabelEncoder()
          df['label'] = encoder.fit_transform(df['label'])
In [57]:
          corr
Out[57]:
                              Ν
                                         P
                                                   K temperature
                                                                    humidity
                                                                                    ph
                                                                                          rain1
                        1.000000 -0.231460
                                           -0.140512
                                                          0.026504
                                                                    0.190688
                                                                              0.096683
                                                                                         0.0590
                    Ν
                       -0.231460
                                                                                        -0.0638
                                  1.000000
                                             0.736232
                                                         -0.127541
                                                                   -0.118734
                                                                              -0.138019
                       -0.140512
                                  0.736232
                                             1.000000
                                                                                        -0.0534
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          temperature
                        0.026504
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                                                                    0.205320
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                                                                                         0.0944
             humidity
                        0.190688
                                 -0.118734
                                             0.190859
                                                          0.205320
                                                                    1.000000
                                                                              -0.008483
                   ph
                        0.096683
                                 -0.138019
                                            -0.169503
                                                         -0.017795
                                                                   -0.008483
                                                                               1.000000
                                                                                        -0.1090
```

rainfall

label

0.059020

-0.031130

-0.063839

-0.491006

-0.053461

-0.346417

-0.030084

0.113606

0.094423

0.193911

-0.109069

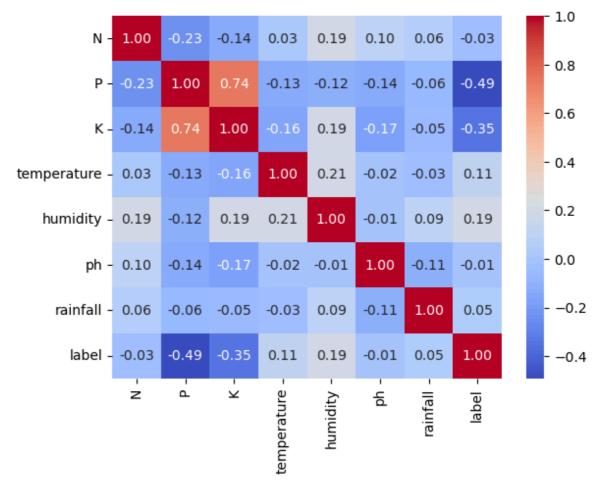
-0.012253

1.0000

0.0456

```
import seaborn as sns
import matplotlib.pyplot as plt

# Generate heatmap
sns.heatmap(corr, annot=True, cmap="coolwarm", fmt=".2f")
plt.show()
```

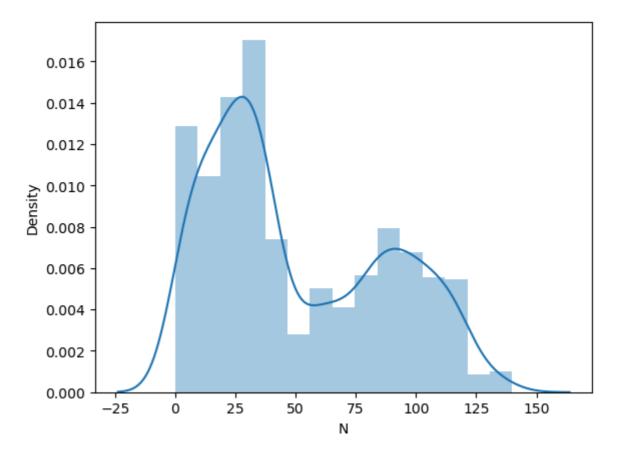


In [61]: crop['label'].value\_counts()

```
Out[61]: label
          rice
                         100
                         100
          maize
          jute
                         100
          cotton
                         100
          coconut
                         100
                         100
          papaya
                         100
          orange
                         100
          apple
                         100
          muskmelon
          watermelon
                         100
                         100
          grapes
         mango
                         100
          banana
                         100
          pomegranate
                         100
          lentil
                         100
          blackgram
                         100
          mungbean
                         100
          mothbeans
                         100
          pigeonpeas
                         100
          kidneybeans
                         100
          chickpea
                         100
                         100
          coffee
          Name: count, dtype: int64
In [63]: sns.distplot(crop['N'])
         plt.show
        C:\Users\gm271\AppData\Local\Temp\ipykernel_15784\1771579408.py:1: UserWarning:
        `distplot` is a deprecated function and will be removed in seaborn v0.14.0.
        Please adapt your code to use either `displot` (a figure-level function with
        similar flexibility) or `histplot` (an axes-level function for histograms).
        For a guide to updating your code to use the new functions, please see
        https://gist.github.com/mwaskom/de44147ed2974457ad6372750bbe5751
```

Out[63]: <function matplotlib.pyplot.show(close=None, block=None)>

sns.distplot(crop['N'])



```
crop_dict ={
In [67]:
              'rice' : 1,
          'maize' : 2,
          'jute' : 3,
          'cotton': 4,
          'coconut' : 5,
           'papaya' : 6,
           'orange' : 7,
           'apple' : 8,
          'muskmelon':9,
          'watermelon':10,
          'grapes' :11,
           'mango' :12,
           'banana' :13,
          'pomegranate' :14,
           'lentil' :15,
           'blackgram':16,
           'mungbean' :17,
           'mothbeans':18,
           'pigeonpeas':19,
           'kidneybeans':20,
           'chickpea':21,
           'coffee':22
          crop['crop_num']=crop['label'].map(crop_dict)
In [71]: crop['crop_num'].value_counts()
```

```
Out[71]: crop_num
           1
                 100
           2
                 100
           3
                 100
           4
                 100
           5
                 100
           6
                 100
           7
                 100
           8
                 100
           9
                 100
           10
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           11
           12
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           15
                 100
           16
                 100
           17
                 100
           18
                 100
           19
                 100
           20
                 100
           21
                 100
                 100
           22
           Name: count, dtype: int64
          crop.drop(['label'],axis=1,inplace=True)
In [79]:
          crop.head()
Out[79]:
                                                             rainfall crop_num
                      K temperature
                                       humidity
                                                      ph
           0 90
                 42 43
                            20.879744 82.002744 6.502985 202.935536
                                                                             1
           1 85
                 58 41
                            21.770462 80.319644 7.038096 226.655537
                                                                             1
           2 60
                 55 44
                            23.004459 82.320763 7.840207 263.964248
                                                                             1
             74
                 35
                    40
                            26.491096 80.158363 6.980401 242.864034
                                                                             1
             78
                 42 42
                            20.130175 81.604873 7.628473 262.717340
                                                                             1
In [93]: #Train test split
          X=crop.drop('crop_num',axis=1)
          y=crop['crop_num']
          X. shape
Out[93]: (2200, 7)
In [95]:
          y.shape
Out[95]: (2200,)
In [97]:
          from sklearn.model_selection import train_test_split
In [101...
          X_train, X_test, y_train, y_test = train_test_split(
              X, y, test_size=0.2, random_state=42)
          X_train.shape
In [103...
```

```
Out[103... (1760, 7)

In [105... X_test.shape

Out[105... (440, 7)

In [107... X_train

Out[107... N P K temperature humidity ph rainfall
```

	N	P	K	temperature	humidity	ph	rainfall
1656	17	16	14	16.396243	92.181519	6.625539	102.944161
752	37	79	19	27.543848	69.347863	7.143943	69.408782
892	7	73	25	27.521856	63.132153	7.288057	45.208411
1041	101	70	48	25.360592	75.031933	6.012697	116.553145
1179	0	17	30	35.474783	47.972305	6.279134	97.790725
•••							•••
1638	10	5	5	21.213070	91.353492	7.817846	112.983436
1095	108	94	47	27.359116	84.546250	6.387431	90.812505
1130	11	36	31	27.920633	51.779659	6.475449	100.258567
1294	11	124	204	13.429886	80.066340	6.361141	71.400430
860	32	78	22	23.970814	62.355576	7.007038	53.409060

1760 rows × 7 columns

```
In [109...
          y_train
Out[109...
           1656
                   7
           752
                   16
           892
                   15
           1041
                   13
           1179
                   12
                   . .
           1638
                   7
           1095
                 13
                   12
           1130
           1294
                   11
           860
                   15
           Name: crop_num, Length: 1760, dtype: int64
In [111...
          #scale the features using MinmaxScaler
          from sklearn.preprocessing import MinMaxScaler
          ms = MinMaxScaler()
          X_train = ms.fit_transform(X_train)
          X_test = ms.transform(X_test)
In [113... X_train
```

```
Out[113... array([[0.12142857, 0.07857143, 0.045
                                                 , ..., 0.9089898 , 0.48532225,
                  0.29685161],
                 [0.26428571, 0.52857143, 0.07 , ..., 0.64257946, 0.56594073,
                  0.17630752],
                           , 0.48571429, 0.1
                 [0.05
                                                 , ..., 0.57005802, 0.58835229,
                  0.08931844],
                 . . . ,
                 [0.07857143, 0.22142857, 0.13
                                                 , ..., 0.43760347, 0.46198144,
                  0.28719815],
                                       , 0.995 , ..., 0.76763665, 0.44420505,
                 [0.07857143, 0.85
                  0.18346657],
                 [0.22857143, 0.52142857, 0.085 , ..., 0.56099735, 0.54465022,
                  0.11879596]])
In [115... #Training Models
In [117...
         from sklearn.linear_model import LogisticRegression
          from sklearn.naive_bayes import GaussianNB
          from sklearn.svm import SVC
          from sklearn.neighbors import KNeighborsClassifier
          from sklearn.tree import DecisionTreeClassifier
          from sklearn.tree import ExtraTreeClassifier
          from sklearn.ensemble import RandomForestClassifier
          from sklearn.ensemble import BaggingClassifier
          from sklearn.ensemble import GradientBoostingClassifier
          from sklearn.ensemble import AdaBoostClassifier
          from sklearn.metrics import accuracy score,confusion matrix
In [119...
         # create instances of all models
          models = {
              'Logistic Regression': LogisticRegression(),
              'Naive Bayes': GaussianNB(),
              'Support Vector Machine': SVC(),
              'K-Nearest Neighbors': KNeighborsClassifier(),
              'Decision Tree': DecisionTreeClassifier(),
              'Random Forest': RandomForestClassifier(),
              'Bagging': BaggingClassifier(),
              'AdaBoost': AdaBoostClassifier(),
              'Gradient Boosting': GradientBoostingClassifier(),
              'Extra Trees': ExtraTreeClassifier(),
          }
          for name, model in models.items():
In [121...
              model.fit(X train,y train)
              ypred = model.predict(X test)
              print(f"{name} with accuracy : {accuracy_score(y_test,ypred)}")
              print("Confusion matrix : ",confusion_matrix(y_test,ypred))
              print("-----")
```

```
Logistic Regression with accuracy: 0.91818181818182
Confusion matrix: [[16 0 3 0 0
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Naive Bayes with accuracy: 0.9954545454545455
Confusion matrix :
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C:\Users\gm271\anaconda3\Lib\site-packages\sklearn\ensemble\\_weight\_boosting.py:5
27: FutureWarning: The SAMME.R algorithm (the default) is deprecated and will be removed in 1.6. Use the SAMME algorithm to circumvent this warning.
 warnings.warn(

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```
In [123... # finally selected randomforest model

rfc = RandomForestClassifier()
    rfc.fit(X_train,y_train)
    ypred = rfc.predict(X_test)
    accuracy_score(y_test,ypred)
```

## Out[123... 0.9931818181818182

```
In [137... # or naivebay's
    gnb = GaussianNB()
    gnb.fit(X_train,y_train)
    ypred = gnb.predict(X_test)
    accuracy_score(y_test,ypred)
```

## Out[137... 0.995454545454555

```
In [127...

def recommendation(N,P,k,temperature,humidity,ph,rainfal):
    features = np.array([[N,P,k,temperature,humidity,ph,rainfal]])
    transformed_features = ms.fit_transform(features)
    prediction = rfc.predict(transformed_features)
    print(prediction)
    return prediction[0]
```

```
crop = crop_dict[predict]
  print("{} is a best crop to be cultivated ".format(crop))
else:
  print("Sorry are not able to recommend a proper crop for this environment")
```

[20]
Kidneybeans is a best crop to be cultivated

```
# new inputs 2
In [131...
          N = 100
          P = 90
          k = 100
          temperature = 50.0
          humidity = 90.0
          ph = 100
          rainfall = 202.0
          predict = recommendation(N,P,k,temperature,humidity,ph,rainfall)
          crop_dict = {1: "Rice", 2: "Maize", 3: "Jute", 4: "Cotton", 5: "Coconut", 6: "Pa
                           8: "Apple", 9: "Muskmelon", 10: "Watermelon", 11: "Grapes", 12:
                           14: "Pomegranate", 15: "Lentil", 16: "Blackgram", 17: "Mungbean
                           19: "Pigeonpeas", 20: "Kidneybeans", 21: "Chickpea", 22: "Coffe
          if predict in crop_dict:
              crop = crop_dict[predict]
              print("{} is a best crop to be cultivated ".format(crop))
              print("Sorry are not able to recommend a proper crop for this environment")
```

[20]

Kidneybeans is a best crop to be cultivated

```
In [133...
         # new inputs 2
          N = 10
          P = 10
          k = 10
          temperature = 15.0
          humidity = 80.0
          ph = 4.5
          rainfall = 10.0
          predict = recommendation(N,P,k,temperature,humidity,ph,rainfall)
          crop dict = {1: "Rice", 2: "Maize", 3: "Jute", 4: "Cotton", 5: "Coconut", 6: "Pa
                           8: "Apple", 9: "Muskmelon", 10: "Watermelon", 11: "Grapes", 12:
                           14: "Pomegranate", 15: "Lentil", 16: "Blackgram", 17: "Mungbean
                           19: "Pigeonpeas", 20: "Kidneybeans", 21: "Chickpea", 22: "Coffe
          if predict in crop_dict:
              crop = crop dict[predict]
              print("{} is a best crop to be cultivated ".format(crop))
          else:
              print("Sorry are not able to recommend a proper crop for this environment")
```

[20]

Kidneybeans is a best crop to be cultivated

```
import pickle
pickle.dump(rfc,open('model.pkl','wb'))
pickle.dump(ms,open('minmaxscaler.pkl','wb'))

In []:
```