Insights on Input Data What kind of data does the system learn from? This dataset is a dataset of measurements taken for **10** categories of **label** The **10** different categories of **label** as per the data are: 1. rice 2. maize chickpea kidneybeans pigeonpeas mothbeans mungbean 8. blackgram lentil 10. pomegranate The total number of data points is **1000** A brief preview of the data is as given below: P label humidity rainfall temperature ph 90 42 43 20.87974371 82.00274423 6.502985292 202.9355362 rice 85 58 41 21.77046169 80.31964408 7.038096361 226.6555374 rice 60 55 44 23.00445915 82.3207629 263.9642476 7.840207144 rice 74 35 40 26.49109635 80.15836264 6.980400905 242.8640342 rice 78 42 42 20.13017482 81.60487287 7.628472891 262.7173405 rice What are the various features of the data used for model training? The various features of the data are: 1. N 2. P 3. K 4. temperature 5. humidity 6. ph 7. rainfall **The Prediction Process** What does Feature Importance mean? Among the 7 features available in the data, the system grades the features based on their importance with respect to the contribution of the features towards the prediction. The graph below shows the relative importance of the 7 features 0.25 0.2 0.15 0.1 0.05 humidity rainfall K **Features** Feature importance refers to the score of input features based on how useful they are at predicting a target variable As can be seen from the graph above, ['humidity', 'rainfall', 'K', 'P', 'N'] are the contributors to the prediction: • humidity contributing to 26.0% • rainfall contributing to 24.0% • K contributing to 22.0% • P contributing to 15.0% • N contributing to 14.0% Let us look at some of the important features in detail The ALE value corresponding to that feature value is difference to the mean effect of that feature. Put differently, the ALE value is the relative feature effect on the prediction at that feature value. This is shown below in the figure as follows ({'apple': 0, 'banana': 1, 'blackgram': 2, 'chickpea': 3, 'coconut': 4, 'coffee': 5, 'cotton': 6, 'grapes': 7, 'jute': 8, 'kidneybeans': 9, 'lentil': 10, 'maize': 11, 'mango': 12, 'mothbeans': 13, 'mungbean': 14, 'coffee': 5, 'cotton': 6, 'grapes': 7, 'jute': 8, 'kidneybeans': 9, 'lentil': 10, 'maize': 11, 'mango': 12, 'mothbeans': 13, 'mungbean': 14, 'mango': 12, 'mothbeans': 13, 'mungbean': 14, 'mango': 14, 'mango': 15, 'mango': 16, 'mango': 16, 'mango': 17, 'mango': 18, 'm Value 2 -6 -6 100 120 140 60 80 20 40 60 80 100 120 140 Ν 2 2 -6 -6 100 150 200 20 40 60 80 100 humidity -4 -6 50 100 150 200 250 300 rainfall 'muskmelon': 15, 'orange': 16, 'papaya': 17, 'pigeonpeas': 18, 'pomegranate': 19, 'rice': 20, 'watermelon': 21}): Let us now look at a specific prediction and understand how the prediction is made **Prediction: apple** P K humidity N rainfall 0.0 133.0 200.0 90.4935574 104.2298028 Why is this predicted as apple? This is predicted as **apple** because the **humidity** > **89.91 AND P** > **68.00 AND N** <= **21.00 AND K** > **49.00 AND rainfall** > **94.77** In general, for almost 95% of observations where the **humidity** > 89.91 AND P > 68.00 AND N <= 21.00 AND K > 49.00 AND rainfall > 94.77, the prediction will be **apple**. **Prediction: banana** \mathbf{N} P \mathbf{K} humidity rainfall 98.0 79.0 50.0 84.47321314 91.06493353 Why is this predicted as banana? This is predicted as **banana** because the P > 68.00 AND N > 85.00 AND K > 49.00 AND 64.55 < rainfall <= 123.59In general, for almost 95% of observations where the **P** > 68.00 **AND N** > 85.00 **AND K** > 49.00 **AND 64.55** < rainfall <= 123.59, the prediction will be banana. **Prediction: blackgram** P \mathbf{N} K humidity rainfall 62.0 21.0 68.13999721 67.15096376 25.0 Why is this predicted as blackgram? This is predicted as **blackgram** because the **60.20** < **humidity** <= **80.54 AND 64.55** < **rainfall** <= **94.77 AND 51.00** < **P** <= **68.00 AND N** <= **37.00 AND K** <= **32.00** In general, for almost 95% of observations where the 60.20 < humidity <= 80.54 AND 64.55 < rainfall <= 94.77 AND 51.00 < P <= 68.00 AND N <= 37.00 AND K <= 32.00, the prediction will be blackgram.**Prediction: chickpea** P N K humidity rainfall 25.0 68.0 77.0 15.11279612 85.74904898 Why is this predicted as chickpea? This is predicted as **chickpea** because the P > 28.00 **AND** K > 49.00 **AND humidity** ≤ 60.20 **AND** 64.55 < rainfall <= 94.77In general, for almost 95% of observations where the P > 28.00 AND K > 49.00 AND humidity <= 60.20 AND 64.55 < rainfall <= 94.77, the prediction will be chickpea. **Prediction: coconut** P N K humidity rainfall 14.0 35.0 149.2433497 33.0 96.66355213 Why is this predicted as coconut? This is predicted as **coconut** because the **rainfall** > 123.59 AND **humidity** > 89.91 AND P <= 28.00 AND K > 20.00 AND N <= 37.00 In general, for almost 95% of observations where the rainfall > 123.59 AND humidity > 89.91 AND P <= 28.00 AND K > 20.00 AND N <= 37.00, the prediction will be coconut. **Prediction: coffee**

humidity

175.60866969999995

50.40609436

75.88298598

83.54193816

20.01730914

67.76252583

63.69070564

51.0845903

56.40226277

83.52706038

90.77069618

90.26408017

93.63739039

42.35249879

89.93701023

84.49774397

84.60808277

humidity

In general, for almost 95% of observations where the $K \le 20.00$ AND N > 85.00 AND 60.20 < humidity <= 89.91 AND 64.55 < rainfall <= 94.77 AND 28.00 < P <= 68.00, the prediction will be **cotton**.

K

In general, for almost 95% of observations where the P > 68.00 AND $N \le 21.00$ AND K > 49.00 AND 60.20 < humidity <= 89.91 AND 64.55 < rainfall <= 94.77, the prediction will be grapes.

88.16513579

rainfall

164.4971875

69.91563467

65.80006004

115.199245

42.89509057

87.75953857

95.23444287

64.16167699

43.25726752

28.75226067

102.6958703

77.71566883

149.299952

108.0458926

240.0810647

42.00660251

rainfall

P N 31.0 27.0 109.0 Why is this predicted as coffee? **Prediction: cotton** N 38.0 15.0 140.0 Why is this predicted as cotton?

Prediction: grapes

Prediction: jute

15.0

86.0

13.0

19.0

71.0

36.0

32.0

4.0

89.0

13.0

49.0

30.0

6.0

60.0

100.0

Prediction: rice

Prediction: lentil

Prediction: maize

Prediction: mango

Prediction: mothbeans

Prediction: mungbean

Prediction: muskmelon

Prediction: orange

Prediction: papaya

Prediction: pigeonpeas

Prediction: pomegranate

N

N

N

Why is this predicted as grapes?

N

Why is this predicted as jute?

N

Why is this predicted as kidneybeans?

N

Why is this predicted as lentil?

N

Why is this predicted as maize?

N

Why is this predicted as mango?

N

Why is this predicted as mothbeans?

Why is this predicted as mungbean?

N

Why is this predicted as muskmelon?

N

Why is this predicted as orange?

 \mathbf{N}

Why is this predicted as papaya?

N

Why is this predicted as pigeonpeas?

Why is this predicted as pomegranate?

N

 \mathbf{N}

Why is this predicted as watermelon?

Why is this predicted as rice?

Prediction: watermelon

Prediction: kidneybeans

K This is predicted as **coffee** because the **humidity** <= **60.20 AND rainfall** > **123.59 AND N** > **85.00** In general, for almost 95% of observations where the **humidity** <= **60.20 AND rainfall** > **123.59 AND N** > **85.00**, the prediction will be **coffee**. K

P

P

P

P

P

P

P

P

P

This is predicted as papaya because the humidity > 89.91 AND K > 49.00 AND N <= 85.00 AND 51.00 < P <= 68.00

140.0

40.0

69.0

79.0

54.0

26.0

48.0

9.0

23.0

55.0

75.0

18.0

49.0

10.0

P

P

P

44.0

P

This is predicted as **cotton** because the **K** <= **20.00 AND N** > **85.00 AND 60.20** < **humidity** <= **89.91 AND 64.55** < **rainfall** <= **94.77 AND 28.00** < **P** <= **68.00**

195.0

K

19.0

This is predicted as **kidneybeans** because the **humidity** <= 60.20 AND K <= 20.00 AND N <= 37.00 AND 94.77 < rainfall <= 123.59 AND P > 68.00

19.0

16.0

This is predicted as **maize** because the **37.00** < N <= **85.00 AND K** <= **20.00 AND humidity** <= **80.54 AND 64.55** < **rainfall** <= **123.59 AND 28.00** < **P** <= **68.00**

26.0

This is predicted as mango because the humidity <= 60.20 AND P <= 28.00 AND N <= 37.00 AND 94.77 < rainfall <= 123.59 AND 20.00 < K <= 32.00

18.0

19.0

47.0

This is predicted as muskmelon because the rainfall \leq 64.55 AND humidity > 89.91 AND N > 85.00 AND 32.00 < K \leq 49.00 AND P \leq 68.00

This is predicted as **orange** because the **humidity** > **89.91 AND K** <= **20.00 AND P** <= **28.00 AND 64.55** < **rainfall** <= **123.59 AND N** <= **21.00**

6.0

53.0

In general, for almost 95% of observations where the **humidity** > 89.91 AND K > 49.00 AND N <= 85.00 AND 51.00 < P <= 68.00, the prediction will be **papaya**.

25.0

This is predicted as **pigeonpeas** because the **rainfall** > **123.59 AND K** <= **32.00 AND P** > **68.00 AND N** <= **37.00 AND humidity** <= **80.54**

37.0

This is predicted as **pomegranate** because the $P \le 28.00$ AND K > 32.00 AND $N \le 21.00$ AND humidity > 80.54 AND 64.55 < rainfall < 123.59

44.0

53.0

This is predicted as **rice** because the **rainfall** > **123.59 AND 80.54** < **humidity** <= **89.91 AND 28.00** < **P** <= **51.00 AND N** <= **85.00 AND K** <= **49.00**

This is predicted as watermelon because the rainfall <= 64.55 AND N > 85.00 AND P <= 28.00 AND K > 49.00 AND 80.54 < humidity <= 89.91

This is predicted as mungbean because the 80.54 < humidity <= 89.91 AND rainfall <= 64.55 AND K <= 32.00 AND N <= 21.00 AND P <= 51.00

This is predicted as **mothbeans** because the **rainfall** \leq 64.55 AND humidity \leq 60.20 AND 21.00 \leq N \leq 37.00 AND 28.00 \leq P \leq 51.00 AND K \leq 32.00

This is predicted as **lentil** because the **rainfall** \leq 64.55 AND P \geq 68.00 AND 60.20 \leq humidity \leq 80.54 AND N \leq 21.00 AND K \leq 32.00

In general, for almost 95% of observations where the 28.00 < P <= 51.00 AND rainfall > 123.59 AND K > 32.00 AND 60.20 < humidity <= 89.91, the prediction will be jute.

K

K

In general, for almost 95% of observations where the rainfall <= 64.55 AND P > 68.00 AND 60.20 < humidity <= 80.54 AND N <= 21.00 AND K <= 32.00, the prediction will be lentil.

K

K

K

K

In general, for almost 95% of observations where the 37.00 < N <= 85.00 AND K <= 20.00 AND humidity <= 80.54 AND 64.55 < rainfall <= 123.59 AND 28.00 < P <= 68.00, the prediction will be maize.

In general, for almost 95% of observations where the humidity <= 60.20 AND P <= 28.00 AND N <= 37.00 AND 94.77 < rainfall <= 123.59 AND 20.00 < K <= 32.00, the prediction will be mange.

In general, for almost 95% of observations where the **rainfall** <= 64.55 AND humidity <= 60.20 AND 21.00 < N <= 37.00 AND 28.00 < P <= 51.00 AND K <= 32.00, the prediction will be **mothbeans**.

In general, for almost 95% of observations where the 80.54 < humidity <= 89.91 AND rainfall <= 64.55 AND K <= 32.00 AND N <= 21.00 AND P <= 51.00, the prediction will be mungbean.

In general, for almost 95% of observations where the **rainfall** <= **64.55 AND humidity** > **89.91 AND N** > **85.00 AND 32.00** < **K** <= **49.00 AND P** <= **68.00**, the prediction will be **muskmelon**.

In general, for almost 95% of observations where the humidity > 89.91 AND K <= 20.00 AND P <= 28.00 AND 64.55 < rainfall <= 123.59 AND N <= 21.00, the prediction will be orange.

K

K

In general, for almost 95% of observations where the **rainfall** > 123.59 AND K <= 32.00 AND P > 68.00 AND N <= 37.00 AND humidity <= 80.54, the prediction will be **pigeonpeas**.

K

In general, for almost 95% of observations where the P <= 28.00 AND K > 32.00 AND N <= 21.00 AND humidity > 80.54 AND 64.55 < rainfall <= 123.59, the prediction will be pomegranate.

In general, for almost 95% of observations where the **rainfall** > 123.59 AND 80.54 < **humidity** <= 89.91 AND 28.00 < P <= 51.00 AND N <= 85.00 AND K <= 49.00, the prediction will be **rice**.

K

In general, for almost 95% of observations where the **rainfall** <= 64.55 AND N > 85.00 AND P <= 28.00 AND K > 49.00 AND 80.54 < humidity <= 89.91, the prediction will be **watermelon**.

 \mathbf{K}

K

K

In general, for almost 95% of observations where the humidity <= 60.20 AND K <= 20.00 AND N <= 37.00 AND 94.77 < rainfall <= 123.59 AND P > 68.00, the prediction will be kidneybeans.

This is predicted as grapes because the P > 68.00 AND $N \le 21.00$ AND K > 49.00 AND $60.20 \le humidity \le 89.91$ AND $64.55 \le rainfall \le 94.77$

39.0

This is predicted as **jute** because the **28.00** < **P** <= **51.00 AND rainfall** > **123.59 AND K** > **32.00 AND 60.20** < **humidity** <= **89.91**