



## Research article

# Application of Decision Tree Algorithm for Classification of Rice Yields in Sumatra

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### ABSTRACT

Rice is the main food crop in Indonesia, most of the agricultural sector in Indonesia is dominated by rice farming including on the island of Sumatra. A common problem that arises is how to find out the areas that produce the most rice each year on the island of Sumatra. This study aims to classify the areas that produce the most rice on the island of Sumatra. The dataset used in this study was taken from Kaggle with a total of 225 data and will be tested using the Decision Tree algorithm and several other algorithms. For data visualization, Tableau will be used to see which areas produce the most rice on the island of Sumatra. By using the research method using the Decision Tree algorithm, an accuracy of 97.78% was obtained with a data split of 0.8 for training data and 0.2 for testing data.

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## 1. Introduction

Food is one of the basic and fundamental needs for humans that must be met. Fulfillment of food needs is carried out as an effort so that food is always available at all times and can also be reached by all levels of society.[1]. Indonesia is an agricultural country where agriculture plays an important role because it is rich in natural resources, such as food crops and horticulture.[2][3][4][5]. As one of the industrial sectors, agriculture is part of the work and also the fulfillment of community needs such as staple food needs. Fertile land is a supporting factor for the development of plant growth and Sumatra Island has a fairly large and fertile land for agricultural areas in this case food crops.[6][7]. Rice is a food crop consumed by the majority of Indonesian people. Currently, the dependence of Indonesian people on plants is still very large, especially rice, which is the staple food of Indonesian people. Sumatra Island is one of the largest rice producing areas in Indonesia.

To get good quality rice in the future, of course, we must look at the condition of the harvest in previous years, besides that, climate conditions and temperature also greatly affect the growth and development of rice plants. There are several factors that drive the harvest of the rice plant,

namely, temperature, rainfall, humidity and also the area of land. If these factors are good, the harvest obtained will be of good quality and also the harvest will be abundant.[8][9][10].

In this study, the problem raised is which areas produce the most rice on the island of Sumatra, how much rainfall and temperature in the area so that it can produce rice in large quantities, so it is necessary to conduct research using datasets from previous years' harvests as a reference for classifying the areas that produce the most or the largest rice on the island of Sumatra.

To perform this classification, the Decision Tree algorithm method is used. Decision Tree is a tree structure, where each leaf node represents a certain class data group. The topmost node level is called the root, which has the greatest influence on a class, and can be the first rule that influences[11][12]. In this study, the accuracy results were obtained at 97.78 with a data split ratio of 0.8 (training data) and 0.2 (testing data). In addition to the Decision Tree, tests were also carried out with other algorithms such as Deep Learning.[13]and Naïve Bayes[14][15]to compare which method is best.

The purpose of this study is to increase insight into the agricultural conditions, especially for rice plants on the island of Sumatra and the largest rice-producing areas on the island of Sumatra. In addition, this paper also aims to cluster the largest rice-producing areas in Indonesia.

## 2. Research methodology

In this study, the method used is as shown in the following image.

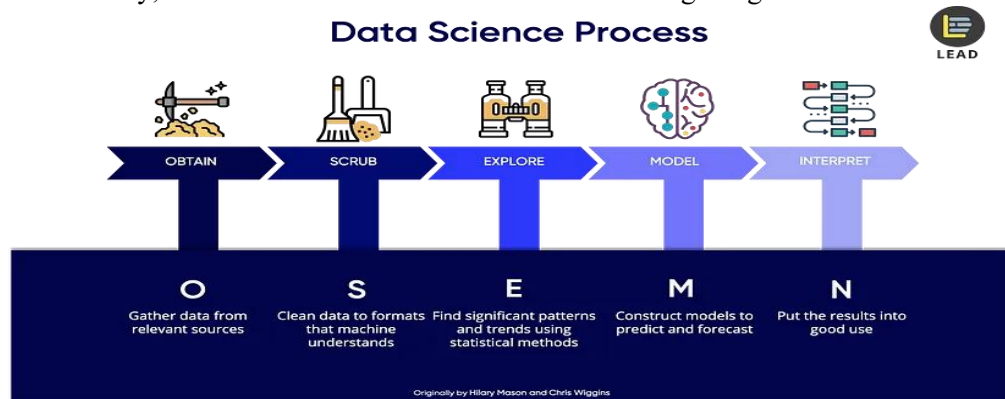


Figure 1. Data Science Process for Conducting Research

### 2.1 Data Obtain

Data Obtain is a collection of data on Rice Plants on Sumatra Island which is taken from a trusted source, namely Kaggle as a source of obtaining relevant data to conduct this research because data accuracy is very important so that the data obtained has high quality so that it will produce good results too.

### 2.2 Scrub Data

Data Scrub is the cleaning of Rice Plant data on Sumatra Island that has been taken earlier so that there is no lost data or missing data so that each research step can run smoothly, data cleaning here uses the Excel application to scrub the data.

### 2.3 Exploration Data

After the data is cleaned, the next step is to explore the Rice Plant data on Sumatra Island. The purpose of this data exploration is to find out what factors support the abundance of

rice harvests in Sumatra, whether there are many or not. For data exploration, the Tableau application is used to explore rainfall, temperature, and also rice production groups on Sumatra Island.

## 2.4 Data Modeling

After completing the data exploration, the next step is to build a model to classify the selected data. The model development here uses rapidminer to classify which areas produce the most rice from year to year.

## 2.5 Data Interpret

The final step in this study process is to present the results of the research that has been done. This research will be presented in the form of a scientific journal and will be presented to the supervising lecturer as a sign that the research has been carried out in accordance with existing rules.

# 3. Results of Data Science Research Steps

## 3.1 Data Obtain

Data Obtain is a collection of Rice Plant data on Sumatra Island taken from a trusted source, namely Kaggle as a source of obtaining relevant data to conduct this research because data accuracy is very important so that the data obtained has high quality so that it will produce good results too.



Figure 2. Dataset Used From Kaggle

| Provinsi | Tahun | Produksi | Luas Panen | Curah hujan | Kelembapan | Suhu rata-rata |
|----------|-------|----------|------------|-------------|------------|----------------|
| Aceh     | 1993  | 1329536  | 323589     | 1627        | 82         | 26.06          |
| Aceh     | 1994  | 1299699  | 329041     | 1521        | 82.12      | 26.92          |
| Aceh     | 1995  | 1382905  | 339253     | 1476        | 82.72      | 26.27          |
| Aceh     | 1996  | 1419128  | 348223     | 1557        | 83         | 26.08          |
| Aceh     | 1997  | 1368074  | 337561     | 1339        | 82.46      | 26.31          |
| Aceh     | 1998  | 1404580  | 365892     | 1465        | 82.6       | 26.84          |
| Aceh     | 1999  | 1478712  | 359817     | 1778        | 82.79      | 26.14          |
| Aceh     | 2000  | 1486909  | 336765     | 1974.7      | 90.6       | 27.1           |
| Aceh     | 2001  | 1547499  | 295212     | 1688.7      | 69.48      | 28.9           |
| Aceh     | 2002  | 1314165  | 315131     | 1296.8      | 68.75      | 29.2           |
| Aceh     | 2003  | 1246614  | 367636     | 1507.2      | 70.66      | 29.4           |
| Aceh     | 2004  | 1350748  | 370966     | 1097        | 80.84      | 29.4           |
| Aceh     | 2005  | 1411650  | 337893     | 710.5       | 79.5       | 26.8           |
| Aceh     | 2006  | 1552078  | 320789     | 506.5       | 80.8       | 26.73          |
| Aceh     | 2007  | 1556858  | 360717     | 1414        | 81.5       | 26.38          |
| Aceh     | 2008  | 1402287  | 329109     | 1270.4      | 78.5       | 27             |
| Aceh     | 2009  | 1533369  | 359375     | 1577        | 78.7       | 26.9           |
| Aceh     | 2010  | 1788738  | 352281     | 1986        | 81.4       | 27.1           |
| Aceh     | 2011  | 1772962  | 380686     | 1268        | 79.4       | 27.1           |
| Aceh     | 2012  | 1582393  | 387803     | 1098        | 79.6       | 26.9           |
| Aceh     | 2013  | 2331046  | 419183     | 1623.6      | 80.7       | 27             |
| Aceh     | 2014  | 1820062  | 376137     | 2264.4      | 78.3       | 27.1           |
| Aceh     | 2015  | 1956940  | 461060     | 1575        | 80         | 27.1           |
| Aceh     | 2016  | 2180754  | 293067     | 1096        | 83.32      | 27.12          |
| Aceh     | 2017  | 2478922  | 294483     | 1905.9      | 85.57      | 26.51          |
| Aceh     | 2018  | 1751997  | 329515.78  | 1427.8      | 83.98      | 26.48          |

Figure 3. Data From Inside the Dataset Downloaded From Kaggle

In Figure 2. This is the dataset used to research the cases in this journal which was sourced from Kaggle before being downloaded with the name Sumatra Rice Plant Dataset, Indonesia.

In Figure 3. It is the contents of the Kaggle dataset that has been downloaded and in the dataset there is no lost data or missing data. There are several attributes contained in the dataset (1) Province (is the place/area of rice production in Sumatra), (2) Year (is the time recorded when harvesting), (3) Production (is the amount obtained/produced from year to year), (4) Harvested Area (the total area of land harvested in one year), (5) Rainfall (the amount/volume of rain that falls each year), (6) Humidity (is the humidity condition of the surrounding air), (7) Average Temperature (the temperature of the surrounding air)

### 3.2 Data Scrub

Data Scrub is the cleaning of Rice Plant data on Sumatra Island that has been taken earlier so that there is no lost data or missing data so that each research step can run smoothly, data cleaning here uses the Excel application to scrub the data.

| Provinsi | Skala Produksi | Produksi  | Luas Panen | Curah hujan | Kelembapan | Suhu rata-rata |
|----------|----------------|-----------|------------|-------------|------------|----------------|
| Aceh     | Menengah       | 1329536   | 323589     | 1627        | 82         | 26.06          |
| Aceh     | Menengah       | 1299699   | 329041     | 1521        | 82.12      | 26.92          |
| Aceh     | Menengah       | 1382905   | 339253     | 1476        | 82.72      | 26.27          |
| Aceh     | Menengah       | 1419128   | 348223     | 1557        | 83         | 26.08          |
| Aceh     | Menengah       | 1368074   | 337561     | 1339        | 82.46      | 26.31          |
| Aceh     | Menengah       | 1404580   | 365892     | 1465        | 82.6       | 26.84          |
| Aceh     | Menengah       | 1478712   | 359817     | 1778        | 82.79      | 26.14          |
| Aceh     | Menengah       | 1486909   | 336765     | 1974.7      | 90.6       | 27.1           |
| Aceh     | Menengah       | 1547499   | 295212     | 1688.7      | 69.48      | 28.9           |
| Aceh     | Menengah       | 1314165   | 315131     | 1296.8      | 68.75      | 29.2           |
| Aceh     | Menengah       | 1246614   | 367636     | 1507.2      | 70.66      | 29.4           |
| Aceh     | Menengah       | 1350748   | 370966     | 1097        | 80.84      | 29.4           |
| Aceh     | Menengah       | 1411650   | 337893     | 710.5       | 79.5       | 26.8           |
| Aceh     | Menengah       | 1552078   | 320789     | 506.5       | 80.8       | 26.73          |
| Aceh     | Menengah       | 1556858   | 360717     | 1414        | 81.5       | 26.38          |
| Aceh     | Menengah       | 1402287   | 329109     | 1270.4      | 78.5       | 27             |
| Aceh     | Menengah       | 1533369   | 359375     | 1577        | 78.7       | 26.9           |
| Aceh     | Tinggi         | 1788738   | 352281     | 1986        | 81.4       | 27.1           |
| Aceh     | Tinggi         | 1772962   | 380686     | 1268        | 79.4       | 27.1           |
| Aceh     | Menengah       | 1582393   | 387803     | 1098        | 79.6       | 26.9           |
| Aceh     | Sangat Tinggi  | 2331046   | 419183     | 1623.6      | 80.7       | 27             |
| Aceh     | Tinggi         | 1820062   | 376137     | 2264.4      | 78.3       | 27.1           |
| Aceh     | Tinggi         | 1956940   | 461060     | 1575        | 80         | 27.1           |
| Aceh     | Tinggi         | 2180754   | 293067     | 1096        | 83.32      | 27.12          |
| Aceh     | Sangat Tinggi  | 2478922   | 294483     | 1905.9      | 85.57      | 26.51          |
| Aceh     | Sangat Tinggi  | 1751996.9 | 329515.78  | 1427.8      | 83.98      | 26.48          |

Figure 4. Scrubbed Data

In this data scrubbing process, a Production Scale table is added in the data scrubbing process so that the data can be used to run in the algorithm that the author has chosen, and the author removes or deletes the year attribute table because the table does not have much influence on the objectives to be achieved in this study.

### 3.3 Exploration Data

After the data is cleaned, the next step is to explore the Rice Plant data on Sumatra Island. The purpose of this data exploration is to find out what factors support the abundance of rice harvests in Sumatra, whether there are many or not. For data exploration, the Tableau application is used to explore rainfall, temperature, and also rice production groups on Sumatra Island.



Figure 5. Average temperature of each province as a whole

From Figure 5. Looking at the results of this tableau visualization, it can be concluded that the highest average temperature is in the province of North Sumatra with an average temperature of 27,313°C and the lowest average temperature is in West Sumatra with an average temperature of 25,651°C



Figure 6. Average rainfall for each province as a whole

In Figure 6. Looking at the results of this tableau visualization, it can be concluded that the highest average rainfall is in West Sumatra province and the lowest average rainfall is in Aceh province.

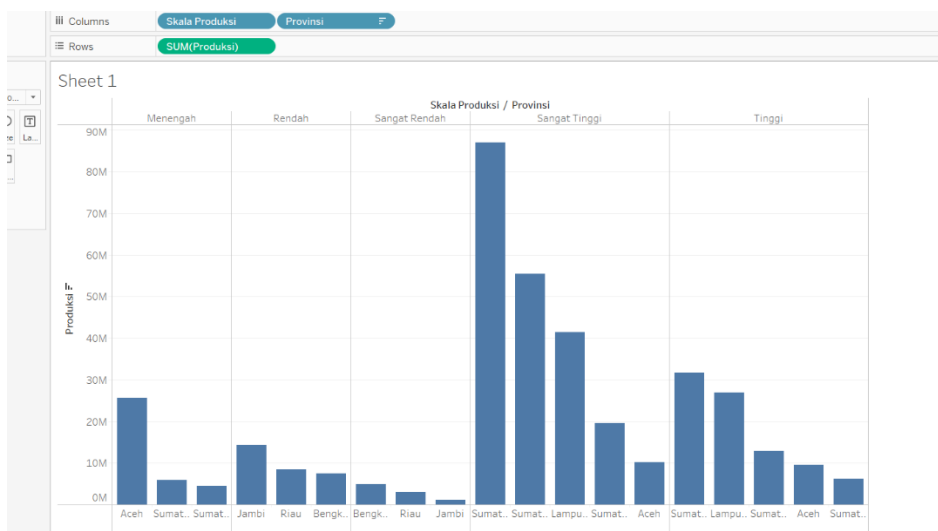


Figure 7. Harvest results from each province according to production scale

In Figure 7. Looking at the results of this tableau visualization, it can be concluded that the highest harvest is in North Sumatra province and the lowest harvest is in Jambi province. Based on rainfall and temperature, the harvest results are as in Figure 7. The conclusion is that in order for the harvest to be abundant, the air temperature should not be too cool or too hot and the rainfall should not be too high because rice can grow well in tropical weather.

### 3.4 Modeling

After completing the data exploration, the next step is to build a model to classify the selected data. The model development here uses rapidminer to classify which areas produce the most rice from year to year.

#### 1.) Decision Tree

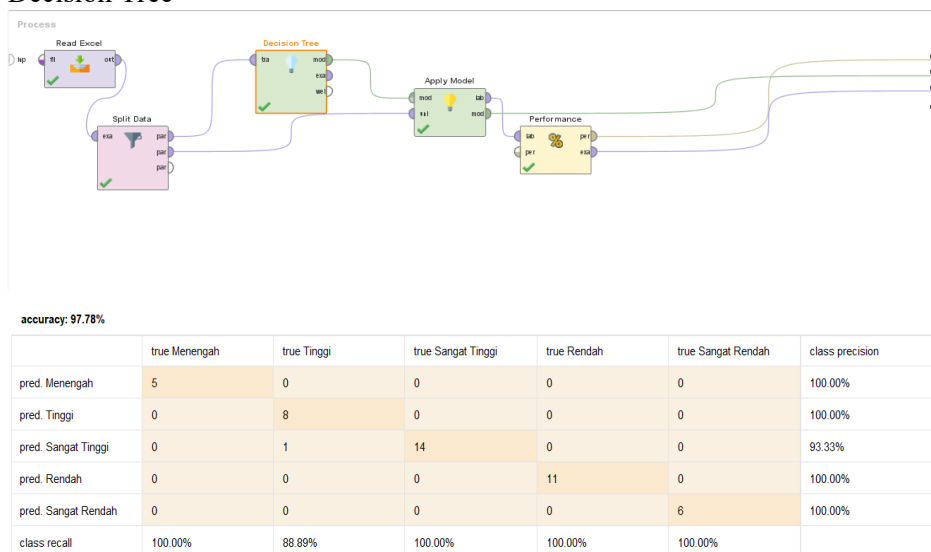


Figure 8. Decision Tree algorithm and results

From the results shown in Figure 8. Using the decision tree method, the accuracy results were 97.78% with a data set division of 0.8 for training data and 0.2 for testing data. The components used in this algorithm are read excel to read the scrubbed dataset, then split data to divide the data into training data and testing data, then there is an algorithm that will be trained, namely the decision tree, apply mode to run the model, and performance to display the percentage of the method used.

## 2.) Naive Bayes

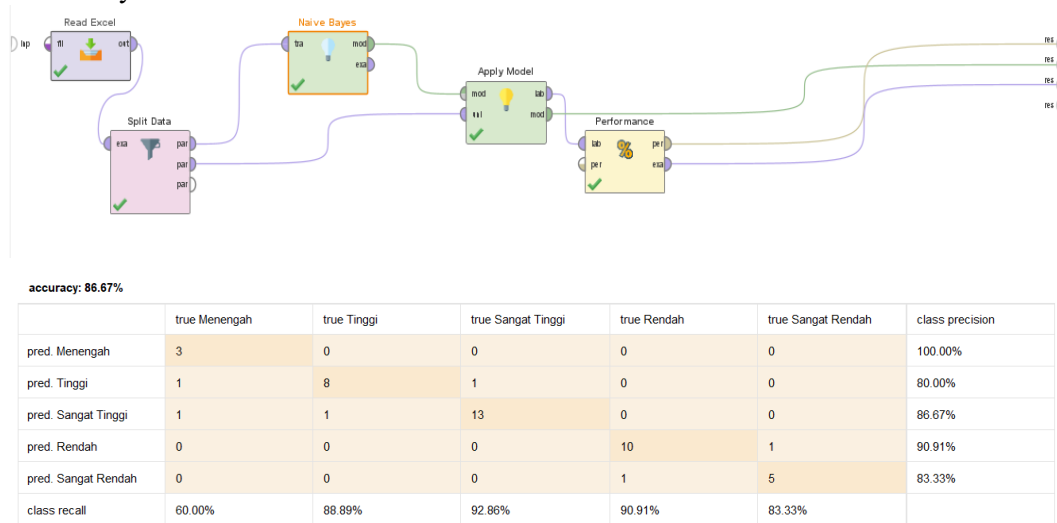
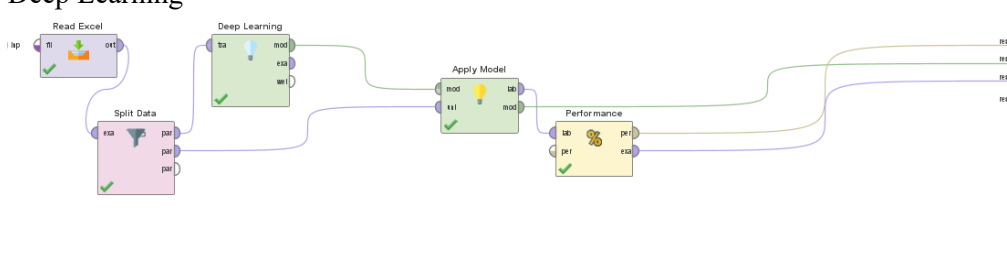


Figure 9. Naïve Bayes algorithm and results

From the results shown in Figure 9. Using the decision tree method, the accuracy results were 86.63% with a data set division of 0.8 for training data and 0.2 for testing data. The components used in this algorithm are read excel to read the scrubbed dataset, then split data to divide the data into training data and testing data, then there is an algorithm that will be trained, namely the decision tree, apply mode to run the model, and performance to display the percentage of the method used.

### 3.) Deep Learning



accuracy: 73.33%

|                     | true Menengah | true Tinggi | true Sangat Tinggi | true Rendah | true Sangat Rendah | class precision |
|---------------------|---------------|-------------|--------------------|-------------|--------------------|-----------------|
| pred. Menengah      | 3             | 1           | 1                  | 0           | 0                  | 60.00%          |
| pred. Tinggi        | 2             | 8           | 2                  | 0           | 0                  | 66.67%          |
| pred. Sangat Tinggi | 0             | 0           | 11                 | 0           | 0                  | 100.00%         |
| pred. Rendah        | 0             | 0           | 0                  | 11          | 6                  | 64.71%          |
| pred. Sangat Rendah | 0             | 0           | 0                  | 0           | 0                  | 0.00%           |
| class recall        | 60.00%        | 88.89%      | 78.57%             | 100.00%     | 0.00%              |                 |

Figure 10. Deep Learning algorithm and results

From the results shown in Figure 10. Using the decision tree method, the accuracy results were 73.33% with a data set division of 0.8 for training data and 0.2 for testing data. The components used in this algorithm are read excel to read the scrubbed dataset, then split data to divide the data into training data and testing data, then there is an algorithm that will be trained, namely the decision tree, apply mode to run the model, and performance to display the percentage of the method used.

### 4. Conclusion

Rice is the main food crop in Indonesia, most of the agricultural sector in Indonesia is dominated by rice farming, including on the island of Sumatra. A common problem that arises is how to find out the areas that produce the most rice each year on the island of Sumatra. This study aims to classify the areas that produce the most rice on the island of Sumatra. The dataset that will be used is taken from Kaggle with a total of 225 data and will be tested using the Decision Tree algorithm and several other algorithms. For data visualization, Tableau will be used to see which areas produce the most rice on the island of Sumatra. By using the research method using the Decision Tree algorithm, an accuracy of 97.78% was obtained with a data split of 0.8 for training data and 0.2 for testing data. In addition, it can also be concluded that production results can be influenced by many factors such as air temperature, rainfall, humidity and others, so this rice cannot live in conditions that are too watery/wet and cannot be too dry. Farmers can do certain things to maximize the care of rice plants so that they can always produce maximum rice production so that the food and economic needs of the Indonesian people can be met properly.

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