Analysis of building energy efficiency dataset using naive bayes classification classifier

B Prasetiyo*, Alamsyah and M A Muslim
Department of Computer Science, FMIPA, Universitas Negeri Semarang

*Corresponding author: budipras@mail.unnes.ac.id

Abstract. The phenomenon of global warming has become a very important and serious issue in recent years. One effort to reduce emissions by applying the green architecture concept to buildings. The purpose of this paper is to classify energy efficiency data sets. The method used by the Naïve Bayesian Classifier algorithm. Results obtained by Kappa statistics Y1 (0.3357) and Y2 (0.4203); Mean absolute error Y1 (0.0368), Y2 (0.0335); Root mean squared error Y1(0.1491), Y2(0.1412). The results of the analysis showed overall height, relative compactness, wall area, and glazing area affected the heating and cooling loads, while the surface area affected the heating load and the roof area affected the cooling load.

1. Introduction
The phenomenon of global warming has become a very important and serious issue in the last few years, this is not separated from the increasingly negative impact of global warming. The impact of global warming is felt by both developed and developing countries. Not only among the government, or diplomacy between countries in international forums, but also among environmental activists and even, news about the effects of global warming has always been a hot conversation in various media and the general public. The United Nations Inter-governmental Panel on Climate Change states that the main cause of global warming is caused by greenhouse gases due to human activities. The composition of greenhouse gases is 13% methane, 6% nitrogen oxide and 5% fluorocarbons, and the largest is 76% CO$_2$ carbon dioxide. The amount of CO$_2$ is a significant factor to increase global warming [1]. High CO$_2$ emissions are generated from human activities (anthropogenic) [2], one of which is in buildings. CO$_2$ emissions were produced both during the process of making building materials, the design of house construction to household activities when the house was occupied [3].

The building sector turned out to be the biggest factor causing global warming. The International Energy Agency released a publication that estimates that buildings are responsible for more than 40% of the world's total energy consumption and 24% of contributors to CO$_2$ emissions globally. Buildings consume more than a third of the world's energy compared to the industrial and transportation sectors in consuming fossil energy [4]. As the urban population increases and the population explodes, energy consumption is projected to continue to rise in the building sector, especially in developing countries [5]. Green Building which in this case is also referred to as green architecture (Green Architecture) is an issue that starts to emerge following the issue of global warming [6]. With the concept of green building, it is expected to be able to reduce energy use efficiently and the impact of pollution while building design becomes environmentally friendly. This makes the building-saving classification model very important for every building developer. So that a certain method is needed to classify
energy-efficient building models through recording existing data. Classification problems can be done using methods in data mining [7].

Data mining is an activity to explore and obtain information from large amounts of data [8]. Data mining is used to analyze and extract knowledge automatically. One of the data mining activities is classification techniques that for predicting a value from the target variable category (label category for each data [9]. Activities in classification are extracting data and then predicting the main classification is to predict how the classification value of the data [10]. To do the classification process a classification algorithm is needed. There are several classification algorithms in data mining that are quite popular, one of which is the Naïve Bayesian Classifier algorithm [11]. Naïve Bayesian Classifier is one classification algorithm that works using a statistical (probability) approach. Naïve Bayesian is classified as a simple, easy to use classification algorithm where each attribute is independent and gives the possibility (probability) of the final decision [12]. The results obtained from the classification process need to be measured for performance to test the level of accuracy. In the world of data mining, algorithm performance can be measured by Confusion Matrix. This is a method usually used to calculate accuracy. Confusion Matrix is also known as a contingency table or error matrix [13]. This calculation produces 4 outputs, namely: recall, precision, accuracy and error rate. In addition to evaluation in a calculation, it also needs to be evaluated graphically. Graphical performance measurements on an algorithm can be done using the Receiver Operating Characteristics (ROC) curve or ROC curve. The method used is by calculating the area under the curve called AUC (Area Under the ROC Curve) [11]. The ROC curve is very useful in dealing with classification problems because it graphically shows the visualization of its performance [14].

2. Methods
2.1. Analysis and Data Pre-processing
At this stage data analysis will be used, whether it contains noise or is ready to use. The data used in this study uses the Energy efficiency data set dataset, which is taken from the UCI Machine Learning Repository (Tsanas, 2014). The information about the data is
a. Many samples: 768 samples of building shapes.
b. Number of Attributes: 8, each according to the parameters in the building.
c. Attribute information:
   - X1 relative compactness (relative compactness)
   - X2 surface area (surface area)
   - X3 wall area (wall area)
   - X4 roof area wide roof
   - X5 overall height (overall height)
   - X6 orientation (orientation)
   - X7 glazing area (glass area)
   - X8 glazing area distribution (glass location distribution)
   - y1 heating load (heating load)
   - y2 cooling load (cooling load)
d. Attribute value missing: none
At the preprocessing stage the data is broken down into two parts, namely data for training and data for testing.

3. Result and Discussion
To carry out classification, the data used in this study uses the Energy Efficiency dataset, which is taken from the UCI Machine Learning Repository. From the dataset, there are 768 data, sample data as shown in Table 1.
Table 1. Dataset Sample

| X2  | X3  | X4  | X5  | X6  | X7  | X8  | Y1  | Y2  |
|-----|-----|-----|-----|-----|-----|-----|-----|-----|
| 514.50 | 294.00 | 110.25 | 7.00 | 2   | 0   | 0   | 15.55 | 21.33 |
| 514.50 | 294.00 | 110.25 | 7.00 | 3   | 0   | 0   | 15.55 | 21.33 |
| 514.50 | 294.00 | 110.25 | 7.00 | 4   | 0   | 0   | 15.55 | 21.33 |
| 514.50 | 294.00 | 110.25 | 7.00 | 5   | 0   | 0   | 15.55 | 21.33 |
| 563.50 | 318.50 | 122.50 | 7.00 | 2   | 0   | 0   | 20.84 | 28.28 |
| 563.50 | 318.50 | 122.50 | 7.00 | 3   | 0   | 0   | 21.46 | 25.38 |
| 563.50 | 318.50 | 122.50 | 7.00 | 4   | 0   | 0   | 20.71 | 25.16 |
| 563.50 | 318.50 | 122.50 | 7.00 | 5   | 0   | 0   | 19.68 | 29.60 |
| 588.00 | 294.00 | 147.00 | 7.00 | 2   | 0   | 0   | 19.50 | 27.30 |
| 588.00 | 294.00 | 147.00 | 7.00 | 3   | 0   | 0   | 19.95 | 21.97 |
| 588.00 | 294.00 | 147.00 | 7.00 | 4   | 0   | 0   | 19.34 | 23.49 |
| 588.00 | 294.00 | 147.00 | 7.00 | 5   | 0   | 0   | 18.31 | 29.70 |
| 612.50 | 318.50 | 147.00 | 7.00 | 2   | 0   | 0   | 17.05 | 23.77 |
| 612.50 | 318.50 | 147.00 | 7.00 | 3   | 0   | 0   | 17.41 | 21.46 |
| 612.50 | 318.50 | 147.00 | 7.00 | 4   | 0   | 0   | 17.84 | 29.79 |
| 612.50 | 318.50 | 147.00 | 7.00 | 5   | 0   | 0   | 17.34 | 29.40 |
| 661.50 | 416.50 | 220.50 | 3.50 | 2   | 0   | 0   | 6.07  | 10.90 |
| 661.50 | 416.50 | 220.50 | 3.50 | 3   | 0   | 0   | 6.05  | 11.19 |
| 661.50 | 416.50 | 220.50 | 3.50 | 4   | 0   | 0   | 6.01  | 10.94 |
| …  | …  | …  | …  | …  | …  | …  | …  | …  |

The classification modeling results using Naïve Bayesian then performed accuracy. The results of performance accuracy are shown in the Table 2.

Table 2. Results of Performance classification

| true 2 | true 3 | true 4 | true 5 | class precision |
|--------|--------|--------|--------|----------------|
| pred. 2 | 360 | 0 | 0 | 0 | 100.00% |
| pred. 3 | 13 | 147 | 0 | 80 | 61.25% |
| pred. 1 | 4 | 0 | 20 | 0 | 83.33% |
| pred. 4 | 0 | 23 | 0 | 78 | 75.00% |
| pred. 5 | 0 | 0 | 0 | 9 | 77.50% |

class recall

| true 2 | true 3 | true 4 | true 5 | class precision |
|--------|--------|--------|--------|----------------|
| 95.49% | 86.47% | 100.00% | 46.71% | 91.18% |

accuracy: 82.81% ±/ 2.56%

The results of the Naïve Bayesian Classifier algorithm produce kappa statistics Y1 (0.3357) and Y2 (0.4203); Mean absolute error Y1 (0.0368), Y2 (0.0335); Root mean squared error Y1 (0.1491), Y2 (0.1412).

4. Conclusion

Development of a green architecture model is carried out by conducting accuracy testing using Rapid miner software. Furthermore, software needs to be made with certain programming languages. The classification results show the accuracy value of 82.81%, meaning that it is quite high and with an average class recall of 83.97% and an average class precision of 79.42%. The building classification results consist of 5 classifications in heating and cooling loads. The results of the Naïve Bayesian Classifier algorithm produce kappa statistics Y1 (0.3357) and Y2 (0.4203); Mean absolute error Y1 (0.0368), Y2 (0.0335); Root mean squared error Y1 (0.1491), Y2 (0.1412).

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