

PROJECT REPORT

COMPARISON LEARNING VECTOR QUANTIZATION AND NAÏVE BAYES ALGORITHM IN AIRLINE PASSENGER SATISFACTION

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Faculty of Computer Science Soegijapranata Catholic University 2022

APPROVAL AND RATIFICATION PAGE

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Semarang, January, 20, 2022

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V

ABSTRACT

Data is something that is very easy to obtain nowadays. Because data is easily obtained and stored digitally, the data becomes very large. For example, data from airline customer satisfaction which reaches around 130000 data. However, to process that much data, an algorithm is needed. Therefore, here I use the Naive Bayes algorithm and learning vector quantization (LVQ). Both algorithms are algorithms for classifying. This study was conducted to determine whether the two algorithms can be used in classifying airline passenger satisfaction data. I also compared the two algorithms to find out which one is better at classifying the airline satisfaction data. The level of accuracy becomes a parameter to determine a better algorithm.

In completing this research, several steps were carried out. The first step is to get and process the data. In processing the data, data preprocessing is carried out, namely deleting empty data and changing the data so that the program can process it. After that, the classification process is carried out using both algorithms. Each algorithm test was carried out 5 tests with different amounts of training data, namely 90%, 75%, 50%, 25% and 10%. After the test is complete, the accuracy of all tests is calculated. The average accuracy of each test with different training data will be the accuracy value of the algorithm.

From the results of the testing that has been done, there are 5 tests for naive Bayes and also 5 tests for learning vector quantization. The accuracy results obtained are the average Naive Bayes accuracy of 89.076% while the average accuracy of learning vector quantization is 79.39% for the airline's passenger satisfaction data. So it can be concluded that the two algorithms can be used to classify airline passenger satisfaction data and the Naive Bayes algorithm is better than learning vector quantization.

Keyword: naive_bayes, bayesian, learning_vector_quantization, lvq

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CHAPTER 1 INTRODUCTION

1.1. Background

Passenger satisfaction is one of the important factors for the improvement of an airline. The airline can find out what things need to be improved. With the hope that more and more airplane passengers use the airline, of course this increase must be done so that income also increases. To improve service, of course, you must know what things make passengers satisfied. This can be done from the data of passengers who have traveled by plane.

In this digital era, data is very easy to store and obtain. Not like in the past, which used paper to record data, but used the help of computers. One of the advantages is that it is easy to store large amounts of data, including passenger satisfaction data. If there are about 130,000 airline passenger satisfaction data, of course it is very difficult to process manually. This will make it difficult for airlines to improve services.

Because data storage uses a computer, we can also use a computer to process it. However, to process the existing data in order to get the results we want, an algorithm is needed. With the algorithm implemented on passenger satisfaction data, we can classify things that can make passengers satisfied with airline flight services. Of course, this is better than processing thousands of data manually.

Therefore, this time I implemented the Learning Vector Quantization (LVQ) and Naïve Bayes algorithms on the airline passenger satisfaction data that I got through Kaggle. It is hoped that this algorithm can process thousands of existing data and classify them. I am using 2 different algorithms so that I can compare the results of each implemented algorithm. And also, to find out which algorithm is better for classifying airline passenger satisfaction data by comparing the accuracy of the two algorithms. The results of this classification algorithm are expected to help airlines know what to do in the future.

1.2. Problem Formulation

From the background above, we can formulate the existing problems.

- 1. Can the Naïve Bayes algorithm classify airline passenger satisfaction data?
- 2. Can the Learning Vector Quantization algorithm classify airline passenger satisfaction data?
- 3. Based on the level of accuracy, which algorithm is better in classifying passenger satisfaction data?

1.3. Scope

In this project, I applied Learning vector quantization and Naive Bayes algorithm only for the data I used from https://www.kaggle.com/binaryjoker/airline-passenger-satisfaction with 129,880 data. The data consists of 23 measuring columns and 1 response column. To find out a better algorithm, I use the accuracy parameters of each algorithm. There will be 5 tests for each algorithm with a percentage of training data of 90%, 75%, 50%, 25%, and finally 10%.

1.4. Objective

The purpose of this project is to find out whether the Learning Vector Quantization and Naive Bayes algorithms can classify aircraft passenger satisfaction from existing data. In addition, to find out from the two implemented algorithms, which algorithm is better based on the level of accuracy.

CHAPTER 2 LITERATURE STUDY

Gorzalczany et al. [1] explain that a lot of data mining does not provide deeper explanations and justifications than decisions. Therefore, they apply their knowledge discovery technique based on fuzzy rules to the problem of airline passenger satisfaction. They used a dataset from Kaggle of 259,760 records. With 23 variable columns, the dataset is almost the same as the dataset that I will use. The results obtained are that the most significant attribute is Inflight Entertainment with an accuracy of 75.2%. Followed by the attributes of Seat comfort and Inflight Wi-Fi Service. They do not classify, but can determine which classification variables affect airline passenger satisfaction more.

With the US Airlines dataset which is almost the same as before, Hayadi et al. [2] uses several classification algorithms. The algorithms used are KNN, Logistic regression, Gaussian NB, Decision Trees and Random Forest. The author runs using the GridSearchCV algorithm from Scikit-Learn. Of all the algorithms that have been run, Random forest has the best performance with 99% accuracy, 97% precision and 94% recall. From the many simulations carried out, the authors suggest optimizing the in-flight wi-fi service. After that also simplicity about online booking. Unlike before, this time with around 130,000 data that becomes 70,000 after deleting the NaN (Not a Number) value, it doesn't include inflight entertainment as an attribute that needs to be improved.

Different from the previous ones, but still about airline customer satisfaction. Hanif et al. [3] uses a dataset of 152 respondents who have used one of the Indonesian airlines, namely Lion Air. The data is taken and grouped by occupation so that it becomes 100 data and 5 classes of work. The author uses the SPSS tool to get the conclusions. By looking for multiple regression, validity, reliability, T test, F value test and the coefficient of determination and correlation, it is found that there is a positive and significant influence between service quality, passenger satisfaction and passenger behavioral intentions. The disadvantage of this research is that the data used is too little so that it can get different results if there are more datasets.

In the journal written by Wijayanto et al. [4], the Naive Bayes algorithm is also used for the passenger satisfaction dataset taken from Kaggle. The dataset used is most likely the same as that which will be used from this journal. With 129,880 data, the author uses the help of the KNime application for classification with Naive Bayes. The distribution of training data and data testing consists of 4 experiments. The first is training data: testing data is 90:10, the second is 85:15, the third is 80:20 and the last is 75:25. The results obtained that 90% of training data and 10% of testing data have an accuracy of 81.466%.

Religia and Amali [5] also uses Naive Bayes to classify airline passenger satisfaction. The dataset used is also from Kaggle but is different, as many as 25,976 data. In their research, they used Naive Bayes, Naive Bayes optimized particle swarm Optimization (PSO) and finally Naive Bayes optimized Genetic Algorithm (GA). To measure the performance used accuracy, precision and recall. The results obtained are that Naive Bayes optimized by PSO has the best results, namely the accuracy value is 86.13%, the precision value is 87.9% and the recall value is 87.29%.

Similar to this journal, Nugraha et al. [6] compare Naive Bayes with Learning Vector Quantization (LVQ) to classify. But here it is used to classify uterine diseases. In using Naive Bayes, the author uses 2 methods, Naive Bayes by using Laplacian Smoothing and without using it. The data used are 125 data from the medical records of patients at RSUD Dr. Moewardi Solo. The data here is divided into 4 experiments/simulations with the first experiment being training: the data is 20:80, the second is 40:60, the third is 60:40 and the last is 80:20. The results of 4 trials with training 20%, 40%, 60%, 80% got Naive Bayes without Laplacian Smoothing had 32%, 67.8%, 79%, 88.8% accuracy. These results are less good than if Naive Bayes using Laplician smoothing has an accuracy of 88%, 92.4%, 92.8%, 92.4%. The accuracy is said to be stable even though the training data is changed. Compared to LVQ the accuracy is 82.4%, 88.8%, 89.4%, 95.2%. However, the highest accuracy is obtained from LVQ with 80% training.

In another journal, for LVQ signature pattern recognition compared by Prabowo et al. [7] and combined by Ginting et al. [8]. Prabowo et al. compared with the Kohonen Neural Network (KNN), while Ginting et al. combined with Self Organizing Kohonen (SOK).

In the journal Prabowo et al. did 3 tests. Each test with a different number of classes, resolutions and patterns. In the first test with 25 patterns and a resolution of 30x20 Kohonen had 96% success for 1 second while LVQ was 100% for 2 seconds. Second with 40 patterns and 30x20 resolution with 95% Kohonen less than 1 second while LVQ 92.5% less than 1 second. The last test was 9 patterns with 100x100 resolution with 77.78% Kohonen for 2 seconds and LVQ 88.89%

for 7 seconds. LVQ does have better accuracy than Kohonen, but it takes longer. While in the journal Ginting et al. can speed up the computational process. The combination of LVQ with SOK increases the processing speed of computing during training or during signature pattern recognition.

Unlike previous comparisons or combinations, Meliawati et al. [9] implement LVQ to predict majors at SMA PGRI 1 Banjarbaru. The data used is obtained from the value of report cards in 2010, 2011 and 2013. The data is used as training data, while the value of report cards in 2014 is used as testing data. It is not known how much of the exact amount of data was used. Researchers get 79.31% accuracy for iterations 60 and 90.

Samsir [10] also implements LVQ. LVQ is used to classify Throat Nose and Ear (ENT) disease at Rantauprapat Hospital Labuhanbatu. The input variable consists of 10 disease symptoms. The dataset used is small, which is only 57 data. Of the 57 data divided into 4 training. With the comparison of training data: Testing data is 60:40, second 70:30, third 80:20 and 90:10. In the results of testing accuracy, it is not found that the more testing data, the accuracy will improve. Maybe it's because there are too few datasets, so you might get different results if you get more datasets.

From the journal Gorzalczany et al. [1] and Hayadi et al. [2], the dataset used is almost the same. But both use different algorithms in classifying them. While Hanif et al. [3] using very different datasets and different algorithms, but it's still about passenger satisfaction. However, Wijayanto et al. [4] using the same dataset and algorithm, namely Naive Bayes only, but not compared to LVQ. Likewise, Religia and Amali [5] use only Naive Bayes to classify airline passenger satisfaction, but the datasets used are different. In the journal Nugraha et al. [6] The algorithms both compare LVQ and Naive Bayes, but they use it to classify obstetrical diseases. Prabowo et al. [7] also compared LVQ but with KNN for the case of signature pattern recognition. While Ginting et al. [8] combines LVQ with SOK for signature pattern recognition cases as well. For Meliawati et al. [9] and Samsir [10], they only implement LVQ with different datasets without comparing them or combining them.

CHAPTER 3 RESEARCH METHODOLOGY

3.1. Data Collection

In collecting datasets, I use websites that provide various kinds of datasets. For this research I used data from https://www.kaggle.com/binaryjoker/airline-passenger-satisfaction. Data with the file name airline_passengeer_satisfaction.csv has a file size of 14.34MB. I downloaded this data on September 20, 2021. To download it you are required to Sign In first (Register if you don't have an account). The downloaded file will be a zip file, so it must be extracted to get the csv file. The total data obtained were 129,880 with 23 measuring columns and 1 response column.

3.2. Algorithm

In choosing the algorithm, I consulted my supervisor. During the consultation, my lecturer informed and suggested the Learning Vector Quantization (LVQ) algorithm. This algorithm has not been used very often. Therefore, I use this LVQ algorithm. After using LVQ I looked for another algorithm to use as a comparison. Then I chose Naive Bayes because this algorithm is an algorithm that is often used, easy and has good accuracy. I use these two algorithms to classify supervised learning data about airline passenger satisfaction that has been obtained previously. In addition to knowing which algorithm is better in accuracy.

3.3. Coding and Design

In this step, the MySql tools will be used. MySql is used because the existing dataset is in the form of 2-dimensional data (columns and rows) the same as the MySql database table. In addition, the installation of Mysql is very easy. By downloading xampp through the website https://www.apachefriends.org/download.html. Xampp already provides several versions for Windows, Linux and OS X operating systems. Here I use Linux. After MySql is installed, the data will be preprocessed. Continuous data such as age and distance will be changed first to make it easier to classify.

3.4. Analysis

In analyzing, I will do 5 tests as follows:

Table 3.1. Analysis

| | Training Data | Testing Data |
|-----|---------------|---------------------|
| I | 90% | 10% |
| II | 75% | 25% |
| III | 50% | 50% |
| IV | 25% | 75% |
| V | 10% | 90% |

In this analysis, it is divided into 5 stages to determine whether the amount of training has an effect. Influence on Naive Bayes accuracy and on LVQ accuracy.

3.5. Make a Report

In making the report, I wrote chapters 1-4 first. After chapter 4 finished, I started the coding stage for program development. Then the results that have been carried out during the coding stage will be recorded in the chapter 5 report. And finally, conclusions will be drawn from the results of the coding stage which will be written in chapter 6.

CHAPTER 4 ANALYSIS AND DESIGN

In this research, there are several steps in outline. The first to get the data. The second is data preprocessing. Continued implementation of Naive Bayes and Learning Vector (LVQ) and the last is calculating accuracy. The flow is as in the following workflow:

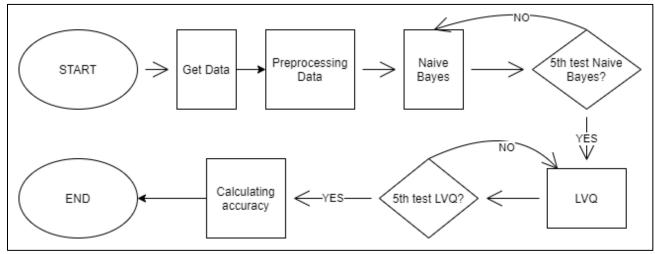


Figure 4.1 Workflow

The first workflow is getting data. The data I use is data taken through Kaggle on September 20, 2021. The file downloaded with the file can be name airline_passenger_satisfaction.csv via the link https://www.kaggle.com/binaryjoker/airlinepassenger-satisfaction. The data has 129,880 records in all. Has 24 attributes consisting of id, 22 input attributes and 1 label attribute. These attributes are as in table 4.1.

Table 4.1. Data Table

| No. | Attribute Name | Attribute Description |
|-----|-----------------------------------|--|
| 1. | Id | Is the id of the data |
| 2. | Gender | "Female" and "Male" |
| 3. | Customer Type | "Loyal Customer" and "Disloyal Customer" |
| 4. | Age | Numbers from 7 to 85 |
| 5. | Type of Travel | "Business travel" and "Personal Travel" |
| 6. | Customer Class | "Business", "Eco" and "Eco Plus" |
| 7. | Flight Distance | Numbers from 31 to 4983 |
| 8. | Inflight Wi-fi Service | "0", "1", "2", "3", "4", "5" |
| 9. | Departure Arrival Time Convenient | "0", "1", "2", "3", "4", "5" |

| 10. | Ease of Online Booking | "0", "1", "2", "3", "4", "5" |
|-----|----------------------------|---|
| 11. | Gate Location | "0", "1", "2", "3", "4", "5" |
| 12. | Food and Drink | "0", "1", "2", "3", "4", "5" |
| 13. | Online Boarding | "0", "1", "2", "3", "4", "5" |
| 14. | Seat Comfort | "0", "1", "2", "3", "4", "5" |
| 15. | Inflight Entertainment | "0", "1", "2", "3", "4", "5" |
| 16. | Onboard Service | "0", "1", "2", "3", "4", "5" |
| 17. | Leg Room Service | "0", "1", "2", "3", "4", "5" |
| 18. | Baggage Handling | "0", "1", "2", "3", "4", "5" |
| 19. | Check in Service | "0", "1", "2", "3", "4", "5" |
| 20. | Inflight Service | "0", "1", "2", "3", "4", "5" |
| 21. | Cleanliness | "0", "1", "2", "3", "4", "5" |
| 22. | Departure Delay in Minutes | Numbers from 0 to 1592 |
| 23. | Arrival Delay in Minutes | Numbers from 0 to 1584 |
| 24. | Satisfaction | "Neutral or dissatisfied" and "Satisfied" |

The id attribute is only used as the line numbering of each record. Meanwhile, the gender attribute to the delay in minutes attribute will be used as input variables for both algorithms. The input variable is the value of the attribute. For example, the variables of gender are female and male. And lastly, the satisfaction attribute is a label attribute. The label attribute is an attribute that already contains the class of each record because the algorithm that will be used is supervised learning, which is an algorithm where the class has been determined. The class consists of 2 classes, namely the "satisfied" and "neutral or dissatisfied" classes.

After the data is obtained, the next step is to enter the data into the database. The data is entered into the database so that it can be processed by the program. From the existing data as shown above, there is data that cannot be processed by the program. Therefore, according to the workflow, the next step after getting the data is "data preprocessing". In this step the data that has a null value will be deleted first. This is so that the data processed is quality data. In preprocessing there are also attribute records that will be changed. Notes will be converted to numbers at small intervals. For example, there are too many age categories, which will then be changed to "0" where the age is <28, then "1" where the age is between 28 and 52, and finally "2" which is over 52. The value of 28 and 52 is based on quantile values that can be seen on the data link is downloaded. There is also data that is not in the form of numbers will be converted to numbers. This is because the LVQ algorithm will be calculated based on the value of the attribute. So that it is converted into a number so that it can be calculated. For example, the original gender "Female" and "Male"

will be changed to "0" and "1". The attributes that are changed in the preprocessing stage are as follows:

Table 4.2. Modified Attribute Data Table

| No. | Attribute Name | Before | After |
|-----|-----------------|---------------------------|--|
| 1. | Gender | "Female" and "Male" | "0" and "1" |
| 2. | Customer Type | "Loyal Customer" and | "0" and "1" |
| | | "Disloyal Customer" | |
| 3. | Age | Numbers from 7 to 85 | "0" (<28), "1" (<52) and "2" (>=52) |
| 4. | Type of Travel | "Business travel" and | "0" and "1" |
| | | "Personal Travel" | |
| 5. | Customer Class | "Business", "Eco" and | "0", "1", and "2" |
| | | "Eco Plus" | |
| 6. | Flight Distance | Numbers from 31 to 4983 | "0" (<=414), "1" (<=1744), "2" (>1744) |
| 7. | Departure Delay | Numbers from 0 to 1592 | "0" (<=12) and "1" (>12) |
| 8. | Arrival Delay | Numbers from 0 to 1584 | "0" (<=13) and "1" (>13) |
| 9. | Satisfaction | "Neutral or dissatisfied" | "0" and "1" |
| | | and "Satisfied" | |

In addition to changing the data, in the preprocessing, deletion of data will be carried out. Deleted data are records that have attributes with null or empty values. This is done so that the data can be processed by the program. I did not change the blank data with 0 or 1 to maintain the quality of the existing data. After deleting the data, the preprocessing step has been completed. The next step is to implement an algorithm for airline passenger satisfaction data.

In implementing the two algorithms, 5 tests will be carried out on each algorithm. In each test, the amount of training data and testing data will be different. The difference in the amount of data is later to see whether the amount of different data will affect the final result. Comparison of the amount of data as shown in the following table.

Table 4.3. Distribution of Training and Testing Data

| Test | Training Data | Testing Data |
|------|---------------|--------------|
| I | 90 % | 10% |
| II | 75% | 25% |
| III | 50% | 50% |
| IV | 25% | 75% |
| V | 10% | 90% |

As in the workflow, after preprocessing it will implement Naive Bayes. Naive Bayes will be tested up to 5 times. Each test will use a different number of datasets as shown in table 4.3. And at the end of the Naive Bayes implementation, the accuracy value will be calculated. Likewise with LVQ, which will test 5 times and look for accuracy. In finding the value of accuracy will use the formula. The formula used is like the following function.

$$Accuracy = \frac{TP + TN}{TP + FN + FP + TN} \times 100\%$$
 (1)

True Positive (TP) = Total class 1 (satisfied) and classified as class 1

True Negative (TN) = Total class 0 (neutral or dissatisfied) and classified as class 0

False Negative (FN) = Total class 1 (satisfied) and classified as class 0

False Positive (FP) = Total class 0 (neutral or dissatisfied) and classified as class 1

Accuracy = The result of dividing the number of correct classifications with the total data and multiplied by 100%

The formula above will be used to find the accuracy value of each test from the two algorithms. Therefore in each test will be calculated the number of TP, TN, FP and FN. After all the tests are complete, the accuracy value of all the tests will be obtained.

For the first, testing will be carried out using the Naive Bayes algorithm. This algorithm is a supervised learning classification algorithm. Which means the class of data has been defined or labeled. In this study, there is the attribute 'satisfaction'. Naive Bayes itself is a good algorithm. Because the formula used is easy and also has a high accuracy value. Broadly speaking, the Bayes theorem formula used is like the following function.

$$P(y|\mathbf{x}) = \frac{P(y) P(\mathbf{x}|y)}{P(\mathbf{x})}$$
(2)

x = attribute class/label

y = attribute input

In the Naive Bayes algorithm there are steps in implementing it. As an example of implementation, in this report I use 20 sample data from data that has been preprocessed. This data will also be used as an example implementation in this report for the LVQ algorithm. The data is as shown in the table below.

Table 4.4. Data Sample Naïve Bayes (20 data)

| id | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 2 | 2 | 2 | 2 |
|----|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|
| | | | | | | | | | | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 0 | 1 | 2 | 3 |
| 1 | 1 | 1 | 0 | 1 | 2 | 1 | 3 | 4 | 3 | 1 | 5 | 3 | 5 | 5 | 4 | 3 | 4 | 4 | 5 | 5 | 1 | 1 | 0 |
| 2 | 1 | 0 | 0 | 0 | 0 | 0 | 3 | 2 | 3 | 3 | 1 | 3 | 1 | 1 | 1 | 5 | 3 | 1 | 4 | 1 | 0 | 0 | 0 |
| 3 | 0 | 1 | 0 | 0 | 0 | 1 | 2 | 2 | 2 | 2 | 5 | 5 | 5 | 5 | 4 | 3 | 4 | 4 | 4 | 5 | 0 | 0 | 1 |
| 4 | 0 | 1 | 0 | 0 | 0 | 1 | 2 | 5 | 5 | 5 | 2 | 2 | 2 | 2 | 2 | 5 | 3 | 1 | 4 | 2 | 0 | 0 | 0 |
| 5 | 1 | 1 | 2 | 0 | 0 | 0 | 3 | 3 | 3 | 3 | 4 | 5 | 5 | 3 | 3 | 4 | 4 | 3 | 3 | 3 | 0 | 0 | 1 |
| 6 | 0 | 1 | 0 | 1 | 1 | 1 | 3 | 4 | 2 | 1 | 1 | 2 | 1 | 1 | 3 | 4 | 4 | 4 | 4 | 1 | 0 | 0 | 0 |
| 7 | 1 | 1 | 1 | 1 | 1 | 1 | 2 | 4 | 2 | 3 | 2 | 2 | 2 | 2 | 3 | 3 | 4 | 3 | 5 | 2 | 0 | 1 | 0 |
| 8 | 0 | 1 | 2 | 0 | 0 | 2 | 4 | 3 | 4 | 4 | 5 | 5 | 5 | 5 | 5 | 5 | 5 | 4 | 5 | 4 | 0 | 0 | 1 |
| 9 | 0 | 1 | 1 | 0 | 0 | 1 | 1 | 2 | 2 | 2 | 4 | 3 | 3 | 1 | 1 | 2 | 1 | 4 | 1 | 2 | 0 | 0 | 0 |
| 10 | 1 | 0 | 0 | 0 | 1 | 1 | 3 | 3 | 3 | 4 | 2 | 3 | 3 | 2 | 2 | 3 | 4 | 4 | 3 | 2 | 0 | 0 | 0 |
| 11 | 0 | 0 | 0 | 0 | 1 | 1 | 4 | 5 | 5 | 4 | 2 | 5 | 2 | 2 | 3 | 3 | 5 | 3 | 5 | 2 | 0 | 0 | 0 |
| 12 | 0 | 1 | 0 | 1 | 2 | 0 | 2 | 4 | 2 | 2 | 1 | 2 | 1 | 1 | 1 | 2 | 5 | 5 | 5 | 1 | 0 | 0 | 0 |
| 13 | 1 | 1 | 2 | 0 | 1 | 1 | 1 | 4 | 4 | 4 | 1 | 1 | 1 | 1 | 1 | 1 | 3 | 4 | 4 | 1 | 1 | 0 | 0 |
| 14 | 1 | 1 | 1 | 1 | 1 | 1 | 4 | 2 | 4 | 3 | 4 | 4 | 4 | 4 | 4 | 5 | 2 | 2 | 2 | 4 | 0 | 0 | 1 |
| 15 | 0 | 1 | 0 | 1 | 1 | 1 | 3 | 2 | 3 | 2 | 2 | 3 | 2 | 2 | 4 | 3 | 2 | 2 | 1 | 2 | 1 | 1 | 0 |
| 16 | 1 | 0 | 0 | 0 | 1 | 1 | 2 | 1 | 2 | 3 | 4 | 2 | 1 | 4 | 2 | 1 | 4 | 1 | 3 | 4 | 0 | 0 | 0 |
| 17 | 0 | 1 | 0 | 0 | 0 | 2 | 3 | 3 | 3 | 3 | 4 | 4 | 4 | 4 | 5 | 3 | 4 | 5 | 4 | 4 | 1 | 1 | 1 |
| 18 | 1 | 1 | 1 | 0 | 0 | 2 | 4 | 4 | 2 | 4 | 4 | 4 | 4 | 5 | 5 | 5 | 5 | 3 | 5 | 5 | 0 | 0 | 1 |
| 19 | 0 | 1 | 1 | 0 | 0 | 2 | 4 | 4 | 4 | 4 | 3 | 4 | 5 | 5 | 5 | 5 | 5 | 3 | 5 | 4 | 0 | 0 | 1 |
| 20 | 1 | 1 | 1 | 1 | 1 | 1 | 2 | 3 | 3 | 2 | 5 | 3 | 5 | 5 | 1 | 2 | 4 | 3 | 2 | 5 | 1 | 1 | 0 |

The table data above will be used as an example of implementation in this chapter 4 report. Column 1 is gender, 2 is customer type and so on as in table 4.1. The Naive Bayes steps used in this study are:

1. Divide the dataset into training datasets and testing datasets. The distribution of the dataset is as shown in table 4.3. For example, I will take 20 sample data that has been preprocessed. Because this is the first test, 18 data are used as training and 2 data as testing. I separate manually by id.

Table 4.5. Training Dataset Naïve Bayes

| id | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 2 | 2 | 2 | 2 |
|----|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|
| | | | | | | | | | | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 0 | 1 | 2 | 3 |
| 1 | 1 | 1 | 0 | 1 | 2 | 1 | 3 | 4 | 3 | 1 | 5 | 3 | 5 | 5 | 4 | 3 | 4 | 4 | 5 | 5 | 1 | 1 | 0 |
| 2 | 1 | 0 | 0 | 0 | 0 | 0 | 3 | 2 | 3 | 3 | 1 | 3 | 1 | 1 | 1 | 5 | 3 | 1 | 4 | 1 | 0 | 0 | 0 |
| 3 | 0 | 1 | 0 | 0 | 0 | 1 | 2 | 2 | 2 | 2 | 5 | 5 | 5 | 5 | 4 | 3 | 4 | 4 | 4 | 5 | 0 | 0 | 1 |
| 4 | 0 | 1 | 0 | 0 | 0 | 1 | 2 | 5 | 5 | 5 | 2 | 2 | 2 | 2 | 2 | 5 | 3 | 1 | 4 | 2 | 0 | 0 | 0 |
| 5 | 1 | 1 | 2 | 0 | 0 | 0 | 3 | 3 | 3 | 3 | 4 | 5 | 5 | 3 | 3 | 4 | 4 | 3 | 3 | 3 | 0 | 0 | 1 |
| 6 | 0 | 1 | 0 | 1 | 1 | 1 | 3 | 4 | 2 | 1 | 1 | 2 | 1 | 1 | 3 | 4 | 4 | 4 | 4 | 1 | 0 | 0 | 0 |
| 7 | 1 | 1 | 1 | 1 | 1 | 1 | 2 | 4 | 2 | 3 | 2 | 2 | 2 | 2 | 3 | 3 | 4 | 3 | 5 | 2 | 0 | 1 | 0 |
| 8 | 0 | 1 | 2 | 0 | 0 | 2 | 4 | 3 | 4 | 4 | 5 | 5 | 5 | 5 | 5 | 5 | 5 | 4 | 5 | 4 | 0 | 0 | 1 |
| 9 | 0 | 1 | 1 | 0 | 0 | 1 | 1 | 2 | 2 | 2 | 4 | 3 | 3 | 1 | 1 | 2 | 1 | 4 | 1 | 2 | 0 | 0 | 0 |
| 10 | 1 | 0 | 0 | 0 | 1 | 1 | 3 | 3 | 3 | 4 | 2 | 3 | 3 | 2 | 2 | 3 | 4 | 4 | 3 | 2 | 0 | 0 | 0 |
| 11 | 0 | 0 | 0 | 0 | 1 | 1 | 4 | 5 | 5 | 4 | 2 | 5 | 2 | 2 | 3 | 3 | 5 | 3 | 5 | 2 | 0 | 0 | 0 |
| 12 | 0 | 1 | 0 | 1 | 2 | 0 | 2 | 4 | 2 | 2 | 1 | 2 | 1 | 1 | 1 | 2 | 5 | 5 | 5 | 1 | 0 | 0 | 0 |
| 13 | 1 | 1 | 2 | 0 | 1 | 1 | 1 | 4 | 4 | 4 | 1 | 1 | 1 | 1 | 1 | 1 | 3 | 4 | 4 | 1 | 1 | 0 | 0 |
| 14 | 1 | 1 | 1 | 1 | 1 | 1 | 4 | 2 | 4 | 3 | 4 | 4 | 4 | 4 | 4 | 5 | 2 | 2 | 2 | 4 | 0 | 0 | 1 |
| 15 | 0 | 1 | 0 | 1 | 1 | 1 | 3 | 2 | 3 | 2 | 2 | 3 | 2 | 2 | 4 | 3 | 2 | 2 | 1 | 2 | 1 | 1 | 0 |
| 16 | 1 | 0 | 0 | 0 | 1 | 1 | 2 | 1 | 2 | 3 | 4 | 2 | 1 | 4 | 2 | 1 | 4 | 1 | 3 | 4 | 0 | 0 | 0 |
| 17 | 0 | 1 | 0 | 0 | 0 | 2 | 3 | 3 | 3 | 3 | 4 | 4 | 4 | 4 | 5 | 3 | 4 | 5 | 4 | 4 | 1 | 1 | 1 |
| 18 | 1 | 1 | 1 | 0 | 0 | 2 | 4 | 4 | 2 | 4 | 4 | 4 | 4 | 5 | 5 | 5 | 5 | 3 | 5 | 5 | 0 | 0 | 1 |

Table 4.6. Testing Dataset Naïve Bayes

| id | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 1 0 | 1 1 | 1 2 | 1 3 | 1 4 | 1 5 | | 1 7 | 1 8 | 1 9 | 2 0 | 2 1 | 2 2 | 2 3 |
|----|---|---|---|---|---|---|---|---|---|--------|--------|-----|--------|--------|--------|---|--------|--------|--------|--------|--------|-----|-----|
| 1 | 0 | 1 | 1 | 0 | 0 | 2 | 4 | 4 | 4 | 4 | 3 | 4 | 5 | 5 | 5 | 5 | 5 | 3 | 5 | 4 | 0 | 0 | 1 |
| 2 | 1 | 1 | 1 | 1 | 1 | 1 | 2 | 3 | 3 | 2 | 5 | 3 | 5 | 5 | 1 | 2 | 4 | 3 | 2 | 5 | 1 | 1 | 0 |

2. Calculate P(x) for each class/label attribute variable ('satisfied' and 'neutral or dissatisfied'). The formula used to find it is as follows.

$$P(x) = \frac{x}{Total\ data} \tag{3}$$

x = Total data class/label from training data

Total data = Total data from training data

P(x) = Probability of variable class/label

The class/label consists of data, there are 2 labels, namely 0 instead of "neutral or dissatisfied" and 1 substitute for "satisfied". Therefore, P (0) and P (1) will be calculated from the training data. Because the number of data that has the label 0 is 12 then:

$$P(0) = \frac{12}{18} = 0.67\tag{4}$$

After that we also look for the value of P (1). Because the number of data that has the label 1 is 6 then:

$$P(1) = \frac{6}{18} = 0.33\tag{5}$$

3. Calculate the probability of the input variable from each class/label or P(a|x). Calculate P(a|x) for all input attributes(gender, customer type, age, etc). The formula used is as follows for each attribute.

$$P(a|x) = \frac{Total\ data\ ax}{Total\ data\ x} \tag{6}$$

a = class input from testing data

x = class/label

Total data ax = Total data where class/label is x and input is a from training data

Total data x = Total data where class/label is x from training data

P(a|x) = Probability of a against x

In the first testing data (id=1), the value of a is 0 for the gender class. Since the number of data with gender 0 and also label 0 is 6 and the number of data with label 0 is 12, then p(gender=0|label=0) is:

$$P(gender = 0|label = 0) = \frac{6}{12} = 0.5$$
 (7)

Next we also look for the probability value for gender 0 as well but with the label 1, the probability is:

$$P(gender = 0|label = 1) = \frac{3}{6} = 0.5$$
 (8)

Because the customer type value in the first testing data is 1, then look for P (customer type = 1 | label=0). After that also calculate P (customer type =1 | label=1). Do the same for the age, type of travel and other attributes. Then we will get P(a|x) a number of input attributes, which is 22 P(a|x).

4. Calculate the result of multiplying P(a|x) all attributes and P(x).

Because the number of attributes is too many, the result of the multiplication of P(a|x) that I show as an example is only the gender and customer type attributes. Then the result of each class/label is:

label 0 = P(gender = 0|label = 0) x P(customer type = 1|label = 0) xx P(label = 0)
=
$$0.5 \times 0.67 \times ... \times 0.67$$

= 0.22445 (9)

label 1 = P(gender = 0|label = 1) x P(customer type = 1|label = 1) xx P(label = 1)
=
$$0.5 \times 1 \times ... \times 0.33$$

= 0.165 (10)

5. The biggest results are prediction results

From the results of label 0 and label 1, it can be seen that label 0 has a greater distance value with a value of 0.22445. Therefore, the prediction result is 0.

- 6. To find the accuracy results later then if:
 - a. Label class "1" and prediction results is "1", TP added 1
 - b. Label class "0" and prediction result is "0", TN added 1
 - c. Label class "1" and prediction results is "0", FN added 1
 - d. Label class "0" and prediction results is "1", FP added 1

In the testing data table, it can be seen that the class/label from the first test (id=1) is 1. However, the prediction result from the calculation that has been done is 0. Therefore, we add 1 number of FN for this first Naive Bayes test.

7. Repeat steps 3-6 for the second test(id=2) and so on until the last id of the testing data.

After step 7 is complete then we calculate the accuracy. To calculate accuracy like Function 1 with input in step 6. Then the first test is done. Repeat steps 1-7 for the second to fifth Naïve Bayes test with the number of training data and datasets as specified. If it has been tested 5 times, then Naïve Bayes has been completed in this study.

After 5 times of testing Naive Bayes, next is the Learning Vector Quantization (LVQ) algorithm. LVQ is a classification algorithm like Naive Bayes which is supervised learning. The architecture of LVQ in this study looks like the following design.

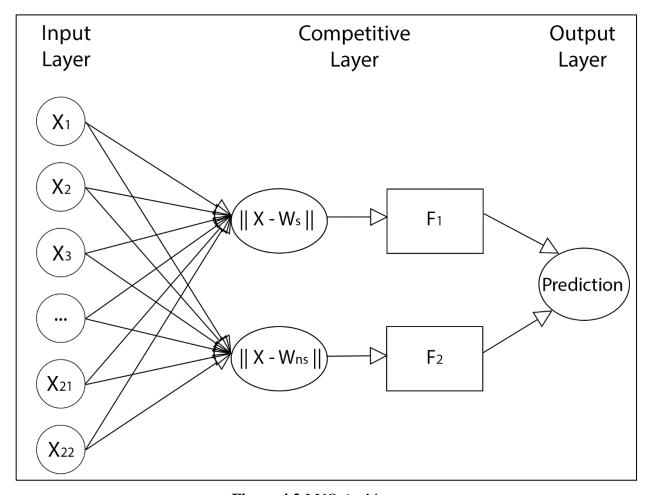


Figure 4.2 LVQ Architecture

In the LVQ architecture there are layers, namely input, process or competitive and finally output. In the input layer, there are 22 inputs, namely X1 to X22. Xn is the value of the input attribute, namely gender as the first attribute, customer type as the second attribute to the 22nd attribute. From 22 inputs it will be 2 in the competitive layer. This is because there are 2 class/labels, namely 'satisfied' and 'neutral or dissatisfied'. To make these two results, calculations are carried out using the Euclidean distance. The calculation is to find the input distance to each class/label. Euclidean distance formula like the following function.

$$||X - Wc|| = \sqrt{\sum (Xn - Wcn)^2}$$
(11)

||X-W|| = Euclidean distance

Xn = Value from attribute n

Wcn = Weight of class/label c and attribute n

After calculating the input to the weight of each class, we can get the prediction results. Prediction results on the output layer can be obtained by looking for a smaller value. However, if the values are the same, it can be determined which class will be entered. Here I specify enter the class "1" which is satisfied. As an example of implementation of LVQ, I use sample for dataset like Naïve Bayes. I use 20 sample datasets. The data is as shown in the table below.

Table 4.7. Data Sample LVQ (20 data)

| id | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 2 | 2 | 2 | 2 |
|----|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|
| | | | | | | | | | | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 0 | 1 | 2 | 3 |
| 1 | 1 | 1 | 0 | 1 | 2 | 1 | 3 | 4 | 3 | 1 | 5 | 3 | 5 | 5 | 4 | 3 | 4 | 4 | 5 | 5 | 1 | 1 | 0 |
| 2 | 1 | 0 | 0 | 0 | 0 | 0 | 3 | 2 | 3 | 3 | 1 | 3 | 1 | 1 | 1 | 5 | 3 | 1 | 4 | 1 | 0 | 0 | 0 |
| 3 | 0 | 1 | 0 | 0 | 0 | 1 | 2 | 2 | 2 | 2 | 5 | 5 | 5 | 5 | 4 | 3 | 4 | 4 | 4 | 5 | 0 | 0 | 1 |
| 4 | 0 | 1 | 0 | 0 | 0 | 1 | 2 | 5 | 5 | 5 | 2 | 2 | 2 | 2 | 2 | 5 | 3 | 1 | 4 | 2 | 0 | 0 | 0 |
| 5 | 1 | 1 | 2 | 0 | 0 | 0 | 3 | 3 | 3 | 3 | 4 | 5 | 5 | 3 | 3 | 4 | 4 | 3 | 3 | 3 | 0 | 0 | 1 |
| 6 | 0 | 1 | 0 | 1 | 1 | 1 | 3 | 4 | 2 | 1 | 1 | 2 | 1 | 1 | 3 | 4 | 4 | 4 | 4 | 1 | 0 | 0 | 0 |
| 7 | 1 | 1 | 1 | 1 | 1 | 1 | 2 | 4 | 2 | 3 | 2 | 2 | 2 | 2 | 3 | 3 | 4 | 3 | 5 | 2 | 0 | 1 | 0 |
| 8 | 0 | 1 | 2 | 0 | 0 | 2 | 4 | 3 | 4 | 4 | 5 | 5 | 5 | 5 | 5 | 5 | 5 | 4 | 5 | 4 | 0 | 0 | 1 |
| 9 | 0 | 1 | 1 | 0 | 0 | 1 | 1 | 2 | 2 | 2 | 4 | 3 | 3 | 1 | 1 | 2 | 1 | 4 | 1 | 2 | 0 | 0 | 0 |
| 10 | 1 | 0 | 0 | 0 | 1 | 1 | 3 | 3 | 3 | 4 | 2 | 3 | 3 | 2 | 2 | 3 | 4 | 4 | 3 | 2 | 0 | 0 | 0 |
| 11 | 0 | 0 | 0 | 0 | 1 | 1 | 4 | 5 | 5 | 4 | 2 | 5 | 2 | 2 | 3 | 3 | 5 | 3 | 5 | 2 | 0 | 0 | 0 |
| 12 | 0 | 1 | 0 | 1 | 2 | 0 | 2 | 4 | 2 | 2 | 1 | 2 | 1 | 1 | 1 | 2 | 5 | 5 | 5 | 1 | 0 | 0 | 0 |
| 13 | 1 | 1 | 2 | 0 | 1 | 1 | 1 | 4 | 4 | 4 | 1 | 1 | 1 | 1 | 1 | 1 | 3 | 4 | 4 | 1 | 1 | 0 | 0 |
| 14 | 1 | 1 | 1 | 1 | 1 | 1 | 4 | 2 | 4 | 3 | 4 | 4 | 4 | 4 | 4 | 5 | 2 | 2 | 2 | 4 | 0 | 0 | 1 |
| 15 | 0 | 1 | 0 | 1 | 1 | 1 | 3 | 2 | 3 | 2 | 2 | 3 | 2 | 2 | 4 | 3 | 2 | 2 | 1 | 2 | 1 | 1 | 0 |
| 16 | 1 | 0 | 0 | 0 | 1 | 1 | 2 | 1 | 2 | 3 | 4 | 2 | 1 | 4 | 2 | 1 | 4 | 1 | 3 | 4 | 0 | 0 | 0 |
| 17 | 0 | 1 | 0 | 0 | 0 | 2 | 3 | 3 | 3 | 3 | 4 | 4 | 4 | 4 | 5 | 3 | 4 | 5 | 4 | 4 | 1 | 1 | 1 |
| 18 | 1 | 1 | 1 | 0 | 0 | 2 | 4 | 4 | 2 | 4 | 4 | 4 | 4 | 5 | 5 | 5 | 5 | 3 | 5 | 5 | 0 | 0 | 1 |
| 19 | 0 | 1 | 1 | 0 | 0 | 2 | 4 | 4 | 4 | 4 | 3 | 4 | 5 | 5 | 5 | 5 | 5 | 3 | 5 | 4 | 0 | 0 | 1 |
| 20 | 1 | 1 | 1 | 1 | 1 | 1 | 2 | 3 | 3 | 2 | 5 | 3 | 5 | 5 | 1 | 2 | 4 | 3 | 2 | 5 | 1 | 1 | 0 |

In doing this LVQ, the steps taken are as follows:

1. Divide the dataset into training datasets and testing datasets. This step is similar to step 1 of Naïve Bayes. Then the training and testing data will look like below.

Table 4.8. Training Dataset LVQ

| id | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 2 | 2 | 2 | 2 |
|----|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|
| | | | | | | | | | | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 0 | 1 | 2 | 3 |
| 1 | 1 | 1 | 0 | 1 | 2 | 1 | 3 | 4 | 3 | 1 | 5 | 3 | 5 | 5 | 4 | 3 | 4 | 4 | 5 | 5 | 1 | 1 | 0 |
| 2 | 1 | 0 | 0 | 0 | 0 | 0 | 3 | 2 | 3 | 3 | 1 | 3 | 1 | 1 | 1 | 5 | 3 | 1 | 4 | 1 | 0 | 0 | 0 |
| 3 | 0 | 1 | 0 | 0 | 0 | 1 | 2 | 2 | 2 | 2 | 5 | 5 | 5 | 5 | 4 | 3 | 4 | 4 | 4 | 5 | 0 | 0 | 1 |
| 4 | 0 | 1 | 0 | 0 | 0 | 1 | 2 | 5 | 5 | 5 | 2 | 2 | 2 | 2 | 2 | 5 | 3 | 1 | 4 | 2 | 0 | 0 | 0 |

| 5 | 1 | 1 | 2 | 0 | 0 | 0 | 3 | 3 | 3 | 3 | 4 | 5 | 5 | 3 | 3 | 4 | 4 | 3 | 3 | 3 | 0 | 0 | 1 |
|----|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|
| 6 | 0 | 1 | 0 | 1 | 1 | 1 | 3 | 4 | 2 | 1 | 1 | 2 | 1 | 1 | 3 | 4 | 4 | 4 | 4 | 1 | 0 | 0 | 0 |
| 7 | 1 | 1 | 1 | 1 | 1 | 1 | 2 | 4 | 2 | 3 | 2 | 2 | 2 | 2 | 3 | 3 | 4 | 3 | 5 | 2 | 0 | 1 | 0 |
| 8 | 0 | 1 | 2 | 0 | 0 | 2 | 4 | 3 | 4 | 4 | 5 | 5 | 5 | 5 | 5 | 5 | 5 | 4 | 5 | 4 | 0 | 0 | 1 |
| 9 | 0 | 1 | 1 | 0 | 0 | 1 | 1 | 2 | 2 | 2 | 4 | 3 | 3 | 1 | 1 | 2 | 1 | 4 | 1 | 2 | 0 | 0 | 0 |
| 10 | 1 | 0 | 0 | 0 | 1 | 1 | 3 | 3 | 3 | 4 | 2 | 3 | 3 | 2 | 2 | 3 | 4 | 4 | 3 | 2 | 0 | 0 | 0 |
| 11 | 0 | 0 | 0 | 0 | 1 | 1 | 4 | 5 | 5 | 4 | 2 | 5 | 2 | 2 | 3 | 3 | 5 | 3 | 5 | 2 | 0 | 0 | 0 |
| 12 | 0 | 1 | 0 | 1 | 2 | 0 | 2 | 4 | 2 | 2 | 1 | 2 | 1 | 1 | 1 | 2 | 5 | 5 | 5 | 1 | 0 | 0 | 0 |
| 13 | 1 | 1 | 2 | 0 | 1 | 1 | 1 | 4 | 4 | 4 | 1 | 1 | 1 | 1 | 1 | 1 | 3 | 4 | 4 | 1 | 1 | 0 | 0 |
| 14 | 1 | 1 | 1 | 1 | 1 | 1 | 4 | 2 | 4 | 3 | 4 | 4 | 4 | 4 | 4 | 5 | 2 | 2 | 2 | 4 | 0 | 0 | 1 |
| 15 | 0 | 1 | 0 | 1 | 1 | 1 | 3 | 2 | 3 | 2 | 2 | 3 | 2 | 2 | 4 | 3 | 2 | 2 | 1 | 2 | 1 | 1 | 0 |
| 16 | 1 | 0 | 0 | 0 | 1 | 1 | 2 | 1 | 2 | 3 | 4 | 2 | 1 | 4 | 2 | 1 | 4 | 1 | 3 | 4 | 0 | 0 | 0 |
| 17 | 0 | 1 | 0 | 0 | 0 | 2 | 3 | 3 | 3 | 3 | 4 | 4 | 4 | 4 | 5 | 3 | 4 | 5 | 4 | 4 | 1 | 1 | 1 |
| 18 | 1 | 1 | 1 | 0 | 0 | 2 | 4 | 4 | 2 | 4 | 4 | 4 | 4 | 5 | 5 | 5 | 5 | 3 | 5 | 5 | 0 | 0 | 1 |

Table 4.9. Testing Dataset LVQ

| id | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 1 0 | 1 | 1 2 | 1 3 | 1 4 | 1 5 | 1 6 | 1 7 | 1 8 | 1 9 | 2 0 | 2 | 2 2 | 2 3 |
|----|---|---|---|---|---|---|---|---|---|--------|---|-----|-----|--------|-----|--------|--------|--------|--------|--------|---|-----|-----|
| 1 | 0 | 1 | 1 | 0 | 0 | 2 | 4 | 4 | 4 | 4 | 3 | 4 | 5 | 5 | 5 | 5 | 5 | 3 | 5 | 4 | 0 | 0 | 1 |
| 2 | 1 | 1 | 1 | 1 | 1 | 1 | 2 | 3 | 3 | 2 | 5 | 3 | 5 | 5 | 1 | 2 | 4 | 3 | 2 | 5 | 1 | 1 | 0 |

2. Initialization

a. The initial weight (W) is randomly or manual selected 1 input data training from each class. Because in this dataset there are 2 class/labels, namely "satisfied" and "neutral or dissatisfied", then there are 2 initial weights. Weight for satisfied (Ws) and Weight for neutral or dissatisfied (Wns).

For example, I manually select data from the training data with id 1 for Wns, because data where id 1 has class/label 0 or "neutral or dissatisfied". Wns1 is the value of the first attribute, namely the gender attribute, so Wns1 is 1. Wns2 is from the second attribute, so Wns2 is 1 and then on to the 22nd attribute of the training data with id 1.

In addition to Wns initialization, it also needs Ws initialization. For example, I manually select data from the training data with id 3 for Ws, because data with id 3 has class/label 1 or "satisfied". Same as Wns initialization, Ws1 is 0. Ws2 is 1 and so on from training data with id 3. So that the initialization value of W is like the table below.

Table 4.10. Initial Weight

| W | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 1 | 2 | 2 | 2 |
|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|---|
| | | | | | | | | | | 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 0 | 1 | 2 |
| S | 0 | 1 | 0 | 0 | 0 | 1 | 2 | 2 | 2 | 2 | 5 | 5 | 5 | 5 | 4 | 3 | 4 | 4 | 4 | 5 | 0 | 0 |
| n | 1 | 1 | 0 | 1 | 2 | 1 | 3 | 4 | 3 | 1 | 5 | 3 | 5 | 5 | 4 | 3 | 4 | 4 | 5 | 5 | 1 | 1 |
| s | | | | | | | | | | | | | | | | | | | | | | |

The data used as weight initialization is not reused during the training process later. Therefore, training data with id 1 and 3 are not reused. To facilitate programming, the data will be removed from the training data so that it is no longer possible to use it.

- b. Maximum Iterations (MaxEpoch). The maximum iteration that I set is 16. I set it that way because the amount of data from the training data is 18 data minus 2 for the initialization weight.
- c. Epoch. Epoch initialization is 1.
- d. Parameters learning rate/alpha (α). Alpha initialization is 0,9
- e. Minimum error (Eps). Eps initialization is 0,0000001

3. Input

- a. Input Xn
 - X = input value
 - n = attribute input to n

The input value is taken from the input attribute values, namely gender, customer type, age and so on. So for the first iteration, the value of X is taken from the first training data. The first training data is data with id 2 because data with id 1 and 3 have been used as initial weights. So X1 is 1, X2 is 0, X3 is 0 and so on.

b. Target = Class/label of data from testing data.

From Input Xn above, the data used is training data with id 2. Therefore, Target is the class/label value of training data with id 2. So the value of target is 0.

4. If Epoch < MaxEpoch or $\alpha >$ eps:

Because the epoch with a value of 1 is less than the max epoch with a value of 16 and an alpha value of 0.9 more than the eps value of 0.0000001 then this provision is true. So it will run the steps below.

a. Find the input distance to each weight using ||X-W||. Then determine the minimum value as the prediction class (J). However, if the distance between the two weights is the same, the prediction class can be determined, whether it is "satisfied" or "neutral or dissatisfied". I specify here as class satisfied.

In this step we will look for weight satisfied (Ws) and weight neutral or not satisfied (Wns). For example, I only use the initial 3 attributes.

$$||X - Ws|| = \sqrt{(X1 - Ws1)^2 + (X2 - Ws2)^2 + (X3 - Ws3)^2 + \cdots}$$

$$||X - Ws|| = \sqrt{(1 - 0)^2 + (0 - 1)^2 + (0 - 0)^2 + \cdots}$$

$$||X - Ws|| = \sqrt{1 + 1 + 0} = 1,4142$$
(12)

$$||X - Wns|| = \sqrt{(X1 - Wns1)^2 + (X2 - Wns2)^2 + (X3 - Wns3)^2 + \cdots}$$
$$||X - Wns|| = \sqrt{(1 - 1)^2 + (0 - 1)^2 + (0 - 0)^2 + \cdots}$$
$$||X - Wns|| = \sqrt{0 + 1 + 0} = 1$$
(13)

Here it can be seen that the results ||X-Ws|| is 1,4142 and ||X-Wns|| is 1. Because the minimum value is 1 that is the result ||X-Wns|| then the prediction result (J) is 0 (neutral or dissatisfied).

- b. Update W_i for each W_n .
 - If J=T then $W_j = W_j + \alpha (X W_j)$
 - \bullet If $J \neq T$ then $W_j \ = W_j \alpha \ (X$ $W_j)$

T=Target

 $W_j = Weight class j$

 α = Learning ratio

j = prediction class

X = data value

 W_n = Weigh index n

The target (T) of the data with id 2 is 0 and J is also 0. So we will change W from prediction class to $Wj^* = Wj + (X - Wj)$. So $Wns1^* = Wns1 + (X1-Wns1)$. Then Wns1 will change to 1, Wns2 to 0.1 and so on until Wns22.

c. Update the value of α .

In updating the alpha value, I use the formula as in the function below

$$\alpha' = \alpha - (\alpha * eps) \tag{14}$$

 α = new learning ratio

 α = learning ratio

MaxEpoch = Maximum Iteration

 α = new learning ratio

Then the value of the new alpha is 0.9 - (0.9 * 0.0000001) which is 0.89999991.

This new alpha value will be used as the alpha value for the next iteration.

- d. If all training data has been processed, then epoch = epoch +1. Then the epoch changes to 2.
- 5. Repeat step 3 and 4 until condition 4 is false

This step will repeat the steps until the condition Epoch < MaxEpoch or alpha > eps is false. The data used is training data. In this loop, the Ws and Wns values will continue to be updated until the condition is false. If the condition is false (stopped) then the last Ws and Wns values will be used for the weights on the testing data.

- 6. After step 5 is complete, do step 3 but from testing data. After that looking for J like 4b. To find the accuracy results then if:
 - a. T class "1" and J class results is "1", TP added 1
 - b. T class "0" and J class results is "0", TN added 1
 - c. T class "1" and J class results is "0", FN added 1
 - d. T class "0" and J class results is "1", FP added 1

In this step 6, we repeat step 3 which is to determine the value of X and the target. This value is obtained from the first testing data (id = 1). So X1=0, X2=1, X3=1 and so on and T=1. After that we calculate ||X-Ws|| and ||X-Wns|| where Ws and Wns are the final results of step 5. Then we will get the predicted value of class(J) by finding the minimum value between ||X-Ws|| and ||X-Wns||. After that we add the value of TP, TN, FN or FP according to the conditions. The addition of this value is the same as when the Naive Bayes algorithm.

7. Repeat step 6 for all testing datasets

In this step we repeat where the X and T data are testing data also for id = 2, id = 3 and so on until the last data from the testing data.

After step 8 is complete, do steps 1-8 with the amount of training data and testing data as shown in table 4.3. Then find the accuracy value of all LVQ tests that have been carried out using function 1. By getting the accuracy value of each LVQ test, the LVQ algorithm is complete.

Then the whole workflow process has also been completed. The accuracy results of the five Naive Bayes tests and the five LVQ tests were then compared. The accuracy of the Naive Bayes 1 test is compared to the accuracy of the LVQ 1 test, the accuracy of the 2 Naive Bayes test is compared to the 2 LVQ test and so on. The result of a better comparison is the sum of the better accuracy of each comparison.

The results of each test will also be seen. Are the 1,2,3,4 and 5 Naive Bayes tests the accuracy results much different or almost the same. Similarly, the results of the 1,2,3,4 and 5 LVQ tests are the accuracy results much different or almost the same.

CHAPTER 5

IMPLEMENTATION AND RESULTS

5.1. Implementation

```
1. LOAD DATA LOCAL INFILE 'airline_passenger_satisfaction.csv'
2. INTO TABLE tbldata
3. FIELDS TERMINATED BY ','
4. ENCLOSED BY ''
5. LINES TERMINATED BY '\n'
6. IGNORE 1 LINES
7. (id,
8. Gender,
9. customer type,
10.

    arrival_delay_in_minutes,

12. satisfaction)
13. SET
14. Gender = IF(Gender = '', null, Gender)
     , customer type = IF(customer type = '', null, customer type)
      , arrival delay in minutes = IF(arrival delay in minutes = '',
null, arrival delay in minutes)
     , satisfaction = IF(satisfaction = '', null, satisfaction);
```

Lines 1-2 to load the downloaded file into the 'tbldata' table with the following conditions. The provisions are as in lines 3-5 based on the csv file format. Row 6 to ignore the first row because the first row is the column heading. Lines 7-17 so that the data in the empty csv (null), when entered into the database remains empty (null).

```
18. INSERT INTO tbldataprocess
19. SELECT * FROM tbldata;
```

Lines 18-19 are used to copy tbldata into tbldataprocess. This is so that tbldata has the exact same data as csv data. The program that will run later is taken from the tbldataprocess data.

```
20. DELIMITER ##
CREATE PROCEDURE preprocessing()
DECLARE i, iwhile, spinformation int INT DEFAULT 0;
24. DECLARE nama, spinformation, spinformation2 VARCHAR(255);
25. DELETE FROM tbldataprocess
26.
    WHERE
27.
     Gender IS NULL or
28.
   customer_type IS NULL or
29. ...
30.
   satisfaction IS NULL;
31. SET @num := 0;
32. UPDATE tbldataprocess SET id = @num := (@num+1);
```

- 33. ALTER TABLE tbldataprocess AUTO_INCREMENT =1;
- 34. -- GENDER
- SELECT count (DISTINCT gender) into i from tbldataprocess;
- 36. SET iwhile = 0;
- 37. WHILE iwhile<>i DO
- 38. SELECT DISTINCT gender INTO spinformation FROM tbldataprocess order by gender ASC limit iwhile, 1;
- UPDATE tbldataprocess set gender=iwhile where gender=spinformation;
- 40. set iwhile= iwhile +1;
- 41. END WHILE ;
- 42. -- Customer Type
- 43. SELECT count(DISTINCT customer type) into i from tbldataprocess;
- 44. SET iwhile = 0;
- 45. WHILE iwhile <> i DO
- 46. SELECT DISTINCT customer_type INTO spinformation FROM tbldataprocess order by customer type ASC limit iwhile, 1;
- 47. UPDATE tbldataprocess set customer_type=iwhile where customer_type =
 spinformation;
- 48. set iwhile= iwhile +1;
- 49. END WHILE ;
- 50. -- AGE
- 51. UPDATE tbldataprocess set age=0 where age <= 27;
- 52. UPDATE tbldataprocess set age=1 where age > 27 and age <= 51;
- 53. UPDATE tbldataprocess set age=2 where age > 51;
- 54. -- Type Of Travel
- 55. SELECT count(DISTINCT type_of_travel) into i from tbldataprocess;
- 56. SET iwhile = 0;
- 57. WHILE iwhile <> i DO
- 58. SELECT DISTINCT type_of_travel INTO spinformation FROM tbldataprocess order by type of travel ASC limit iwhile, 1;
- 59. UPDATE tbldataprocess set type_of_travel=iwhile where type_of_travel=spinformation;
- 60. set iwhile= iwhile +1;
- 61. END WHILE ;
- 62. -- Customer Class
- 63. SELECT count(DISTINCT customer_class) into i from tbldataprocess;
- 64. SET iwhile = 0;
- 65. WHILE iwhile <> i DO
- 66. SELECT DISTINCT customer_class into spinformation FROM tbldataprocess order by customer class ASC limit iwhile, 1;
- 67. UPDATE tbldataprocess set customer_class=iwhile where customer_class=spinformation;
- 68. set iwhile= iwhile +1;
- 69. END WHILE ;
- 70. -- FLIGHT DISTANCE
- 71. UPDATE tbldataprocess set flight_distance=0 where flight_distance <= 414;</p>
- 72. UPDATE tbldataprocess set flight_distance=1 where flight_distance > 414 && flight_distance <= 1744;</p>
- 73. UPDATE tbldataprocess set flight_distance=2 where flight_distance > 1744;
- 74. -- Departure Delay In Minutes
- 75. UPDATE tbldataprocess set departure_delay_in_minutes=0 where departure delay in minutes <= 12;
- 76. UPDATE tbldataprocess set departure_delay_in_minutes=1 where departure delay in minutes > 12;

```
77. -- Arrival Delay In Minutes
78. UPDATE
                                     arrival delay in minutes=0
             tbldataprocess set
                                                                   where
  arrival delay in minutes <= 13;</pre>
79. UPDATE
            tbldataprocess set
                                      arrival delay in minutes=1
                                                                   where
  arrival delay in minutes > 13;
80. -- Satisfaction
81. SELECT count(DISTINCT satisfaction) into i from tbldataprocess;
82. SET iwhile = 0;
83. WHILE iwhile <> i DO
84. SELECT DISTINCT satisfaction into spinformation FROM tbldataprocess
  order by satisfaction ASC limit iwhile, 1;
85. UPDATE
                tbldataprocess set
                                           satisfaction=iwhile
                                                                   where
  satisfaction=spinformation;
86. set iwhile= iwhile +1;
87. END WHILE ;
88. END ##
89. DELIMITER ;
```

Lines 20-89 is a procedure that contains commands to perform preprocessing, namely removing null data and changing data. On lines 20-22 and 88-89 is the program code to create a procedure with the name of the procedure is preprocessing. Lines 23 and 24 to declare the variables that will be used in the procedure. Lines 26-31 are used to delete data that has a null value. Lines 31-33 so that the id attribute returns to order because there is an id that jumps after data is deleted. Lines 35-87 to change all data from tbldataprocess with the conditions as in table 4.2.

```
90. DELIMITER ##
91. CREATE PROCEDURE bayesian (number of testing INT)
92. BEGIN
93. DECLARE prob satisfied, prob gender s, prob customer type s,
94. prob age s, prob type of travel s, prob customer class s,
95. prob flight distance s, prob inflight wifi service s,
96. prob_departure_arrival_time_convenient_s, prob_ease_of_online_booking_s
97. , prob gate location s, prob food and drink s, prob online boarding s,
98. prob seat comfort s, prob inflight entertainment s,
99. prob onboard service s, prob leg room service s,
100.prob baggage handling s, prob checkin service s,
101.prob inflight service s, prob cleanliness s,
102.prob_departure_delay_in_minutes_s, prob_arrival_delay_in_minutes_s
103.FLOAT(30,30) DEFAULT 0;
104.DECLARE total satisfied, total notsatisfied FLOAT(30,20);
105.
106.DECLARE prob notsatisfied, prob gender ns, prob customer type ns,
107.prob age ns, prob type of travel ns, prob customer class ns,
108.prob flight distance ns, prob inflight wifi service ns,
109.prob departure arrival time convenient ns,
110.prob ease of online booking ns, prob gate location ns,
111.prob food and drink ns, prob online boarding ns, prob seat comfort ns,
112.prob inflight entertainment ns, prob onboard service ns,
113.prob leg room service ns, prob baggage handling ns,
114.prob checkin service ns, prob inflight service ns, prob cleanliness ns,
115.prob departure delay in minutes ns, prob arrival delay in minutes ns
```

```
116.FLOAT(30,30) DEFAULT 0;
117.DECLARE prediksi s, prediksi ns FLOAT(30,30);
118.DECLARE i, testing ke, total training, total testing, i testing,
119. total data INT DEFAULT 0;
120.DECLARE info satisfaction VARCHAR(2);
121.
122. SELECT COUNT(*) INTO total data FROM tbldataprocess;
124.SET testing ke = number of testing;
125.IF testing_ke = 1 THEN SET total training = 0.9 * total data;
126. ELSEIF testing_ke = 2 THEN SET total_training = 0.75 * total_data;
127. ELSEIF testing_ke = 3 THEN SET total_training = 0.5 * total_data;
128. ELSEIF testing ke = 4 THEN SET total training = 0.25 * total data;
129. ELSEIF testing ke = 5 THEN SET total training = 0.1 * total data;
130.END IF;
131.SET total testing = total data-total training;
132.SET i testing = 1;
133. UPDATE
                            SET
                                  total data=0,
             tblaccuracy
                                                   tp=0,
                                                            tn=0,
                                                                     fp=0,
  fn=0,tnull=0,fnull=0 WHERE algoritma = 'Bayesian'
                                                          AND testing =
  testing ke;
134.UPDATE tblaccuracy SET total data training=total training, total data =
  total testing WHERE testing = testing ke AND algoritma = "Bayesian";
136. TRUNCATE tbldatatesting;
137.TRUNCATE tbldatatraining;
138.
            INTO tbldatatraining (
139. INSERT
                                          Gender,
                                                   customer type,
  type of travel, customer class, flight distance, inflight wifi service,
  departure arrival time convenient,
                                                  ease of online booking,
                    food and drink,
                                        online boarding, seat comfort,
  gate location,
  inflight entertainment,
                                onboard_service,
                                                        leg_room_service,
  baggage handling,
                      checkin service, inflight service,
                                                             cleanliness,
  departure delay in minutes, arrival delay in minutes, satisfaction)
140.SELECT Gender, customer type, age, type of travel, customer class,
  flight distance,
                                                    inflight wifi service,
  departure arrival time convenient,
                                                   ease of online booking,
  gate location, food and drink,
                                        online boarding, seat comfort,
  inflight entertainment,
                            onboard service,
                                                       leg room service,
  baggage handling, checkin service,
                                        inflight service,
                                                             cleanliness,
  departure delay in minutes, arrival delay in minutes, satisfaction
141.FROM tbldataprocess where id<= total training;
143.INSERT INTO tbldatatesting (Gender, customer type, age, type of travel,
   customer class,
                          flight distance,
                                                    inflight wifi service,
  departure_arrival_time_convenient,
                                                   ease of online booking,
                   food and drink,
                                        online boarding, seat_comfort,
  gate location,
  inflight entertainment,
                                onboard service,
                                                        leg room service,
  baggage_handling, checkin_service, inflight_service, cleanliness,
  departure_delay_in_minutes, arrival_delay_in_minutes, satisfaction)
144.SELECT Gender, customer_type, age, type_of_travel, customer_class,
  flight distance,
                                                    inflight wifi service,
  departure arrival time convenient,
                                                   ease of online booking,
  gate location,
                    food and drink,
                                        online boarding, seat comfort,
  inflight entertainment,
                                onboard service,
                                                       leg room service,
  baggage handling,
                     checkin service,
                                        inflight service, cleanliness,
  departure delay in minutes, arrival delay in minutes, satisfaction
```

```
145.FROM tbldataprocess WHERE
146.id > total training
147.AND id <= ( total training + total testing);
148.
149.SET total satisfied = (SELECT count(satisfaction) FROM tbldatatraining
  WHERE satisfaction = 1);
          total notsatisfied
                               =
                                    (SELECT
                                               count(satisfaction)
                                                                      FROM
  tbldatatraining WHERE satisfaction = 0);
152.SET prob satisfied = total satisfied / total training;
153.SET prob_notsatisfied = total_notsatisfied / total_training;
155. -- WHILE per row tbldatatesting
156.WHILE i testing <= total testing DO
157.-- GENDER
158.SET prob gender s = (SELECT count(gender) FROM tbldatatraining WHERE
   gender=(SELECT gender FROM tbldatatesting where id=i testing)
   satisfaction =1) / total satisfied;
159.SET prob gender ns = (SELECT count(gender) FROM tbldatatraining WHERE
  gender=(SELECT gender FROM tbldatatesting where id=i testing)
  satisfaction =0) / total_notsatisfied;
160.
161. -- Customer Type
162.SET prob customer type s
                                  =
                                      (SELECT
                                              count(customer type)
                                                                      FROM
  tbldatatraining
                    WHERE customer_type=(SELECT
                                                                      FROM
                                                     customer type
  tbldatatesting
                    where
                            id=i testing)
                                            AND
                                                   satisfaction
                                                                =1)
  total satisfied;
163.SET prob customer_type_ns
                                               count(customer type)
                                =
                                     (SELECT
                                                                     FROM
                    WHERE
                            customer type=(SELECT
                                                     customer type
   tbldatatraining
                                                                      FROM
   tbldatatesting
                    where
                            id=i testing)
                                            AND
                                                   satisfaction
                                                                =0)
  total notsatisfied;
164.
165....
166.
167. -- Arrival Delay In Minutes
                prob arrival delay in minutes s
                                                                   (SELECT
  count(arrival_delay_in_minutes)
                                      FROM
                                                tbldatatraining
                                                                     WHERE
  arrival delay in minutes=(SELECT
                                        arrival delay in minutes
                                                                      FROM
  tbldatatesting
                   where id=i testing)
                                            AND
                                                  satisfaction
   total satisfied;
169.SET
                prob arrival delay in minutes ns
                                                                   (SELECT
  count(arrival delay in minutes)
                                                tbldatatraining
                                      FROM
                                                                    WHERE
  arrival delay in minutes=(SELECT
                                      arrival delay in minutes
                                                                      FROM
  tbldatatesting
                   where id=i testing)
                                            AND satisfaction
                                                                  =0) /
  total notsatisfied;
170.
171.SET prediksi s = prob satisfied* prob gender s* prob customer type s*
                     prob_type_of_travel_s*
  prob age s*
                                                    prob customer class s*
  prob_flight_distance s*
                                             prob_inflight_wifi_service s*
  prob departure arrival time convenient s* prob ease of online booking s*
  prob gate location s*
                         prob food and drink s* prob online boarding s*
  prob_seat_comfort_s*
                                            prob inflight entertainment s*
  prob onboard service s*
                                                  prob leg room service s*
  prob baggage handling s*
                                                   prob checkin service s*
  prob inflight service s*
                                                       prob cleanliness s*
  prob departure delay in minutes s* prob arrival delay in minutes s;
```

```
prob_gender ns*
172.SET
             prediksi_ns
                              =prob notsatisfied*
                              prob_age_ns*
                                               prob type of travel ns*
  prob customer type ns*
  prob customer class ns*
                                                prob flight distance ns*
  prob inflight wifi service ns*
  prob departure arrival time convenient ns*
  prob inflight entertainment ns*
                                                prob onboard service ns*
  prob_leg_room service ns*
                                               prob baggage handling ns*
  prob_checkin_service_ns* prob_inflight_service_ns* prob_cleanliness_ns*
  prob_departure_delay_in_minutes_ns* prob_arrival_delay_in_minutes_ns;
173.
174. SELECT satisfaction INTO info satisfaction from tbldatatesting where id
  = i testing;
175.
176.
177.IF info satisfaction = 0 THEN -- actual not satisfied
178. IF prediksi s < prediksi ns THEN
       UPDATE tblaccuracy SET tn=tn+1 WHERE algoritma="Bayesian" AND
179.
180.
       testing=testing ke;
181. ELSEIF prediksi s > prediksi ns THEN
      UPDATE tblaccuracy SET fp=fp+1 WHERE algoritma="Bayesian" AND
182.
183.
       testing=testing ke;
184. ELSEIF prediksi s = 0 AND prediksi ns = 0 THEN
185. UPDATE tblaccuracy SET fnull=fnull+1 WHERE algoritma="Bayesian" AND
186.
       testing=testing ke;
187. END IF;
188.ELSEIF info satisfaction = 1 THEN -- actual satisfied
189. IF prediksi s < prediksi ns THEN
      UPDATE tblaccuracy SET fn=fn+1 WHERE algoritma="Bayesian" AND
190.
191.
      testing=testing_ke;
192. ELSEIF prediksi s > prediksi ns THEN
193. UPDATE tblaccuracy SET tp=tp+1 WHERE algoritma="Bayesian" AND
       testing=testing ke;
195. ELSEIF prediksi s = 0 AND prediksi ns = 0 THEN
      UPDATE tblaccuracy SET tnull=tnull+1 WHERE algoritma="Bayesian" AND
196.
197.
       testing=testing ke;
198. END IF;
199.END IF;
200.SET i testing = i testing+1;
201.END WHILE;
202.
203.END ##
204. DELIMITER ;
```

Lines 90-92 and 201-202 are creating a procedure with a bayesian name that will perform the Naive Bayes algorithm. This procedure has parameters to determine how many tests. Lines 93-103 to declare the variable used to store the result P(gender=1|label=a). Line 104 to store the values P(gender=1) and P(gender=0). While lines 106-116 for the results P(gender=0|label=a).

On lines 122-131 to determine the amount of distribution of training and testing data. Then it will be entered into tbldatatraining and tbldatatesting as much as the previous amount. The data entered comes from tbldataprocess.

In lines 156 and 200-201 are repetitions for tbldatatesting which include steps 3-6 Naive Bayes. This iteration is the 7th step of Naive Bayes. In lines 158-169 calculate the probability of P(a|x) for both class/label x that is "satisfied" and "neutral or dissatisfied" from all input attributes.

Lines 171-172 to get the result of multiplying P(a|x) all attributes and P(x) as in step 4 of Naive Bayes. Then 174-201 to get the prediction result and also add tp, tn, fn or fp to tblaccuracy. Here I also add tnull and fnull to see if there are any unpredictable tests.

```
205.DELIMITER ##
206.CREATE PROCEDURE processb()
207.BEGIN
208. CALL bayesian(1);
209. CALL bayesian(2);
210. CALL bayesian(3);
211. CALL bayesian(4);
212. CALL bayesian(5);
213. UPDATE tblaccuracy SET accuracy = ((tp+tn)/(tp+tn+fp+fn+tnull+fnull))*100 where algoritma='Bayesian';
214.END ##
215.DELIMITER;
```

On lines 205-215 this is a procedure used to call a Bayesian procedure with parameters 1-5. These parameters indicate how many tests to determine the amount of training and testing data. Then after running the Naive Bayes algorithm 5 times, the accuracy value will be searched on line 213.

```
216.DELIMITER ##
217. CREATE FUNCTION ed(
218. wlt FLOAT(30,20)
219. , w1 FLOAT(30,20)
220. .....
221.
     , w22t FLOAT(30,20)
     , w22 FLOAT(30,20)
222.
223. )
224.RETURNS FLOAT (30,20)
225.BEGIN
226. DECLARE hasil FLOAT(30,20) DEFAULT 0;
227. SET hasil = SQRT((
228.
     POWER((w1t - w1),2)
229.
       + POWER((w2t - w2),2)
230.
       + POWER((w3t - w3),2)
231.
231. ......
232. + POWER((w22t - w22),2)));
233. RETURN (hasil);
```

```
234.END; ##
235.DELIMITER;
```

This line 216-235 is the code for creating the ed function. This function returns a Euclidian distance value from the given parameter. This function will be used during the LVQ algorithm.

```
236.DELIMITER ##
237. CREATE PROCEDURE lvq(number of testing INT, pAlpha FLOAT(30,20), pEps
  FLOAT (30,20))
238.BEGIN
239. -- Weight of class satisfied
240.DECLARE w1s, w2s, w3s, w4s, w5s, w6s, w7s, w8s, w9s, w10s, w11s, w12s,
  w13s, w14s, w15s, w16s, w17s, w18s, w19s, w20s, w21s, w22s, w23s
  FLOAT (30,20) DEFAULT 0;
241. -- Weight of class neutral or dissatisfied
242.DECLARE wlns, w2ns, w3ns, w4ns, w5ns, w6ns, w7ns, w8ns, w9ns, w10ns,
  w11ns, w12ns, w13ns, w14ns, w15ns, w16ns, w17ns, w18ns, w19ns, w20ns,
  w21ns, w22ns ,w23ns FLOAT(30,20) DEFAULT 0;
243. -- Weight of training
244.DECLARE w1t, w2t, w3t, w4t, w5t, w6t ,w7t, w8t, w9t, w10t, w11t, w12t,
  w13t, w14t, w15t, w16t, w17t, w18t, w19t, w20t, w21t, w22t, w23t
  FLOAT(30,20) DEFAULT 0;
245. -- Get id for initial class satisfied and not
246.DECLARE ids, idns, cj, t, epoch, maxepoch, pepoch INT DEFAULT 0;
248.DECLARE tn lvq, fp lvq, fn lvq, tp lvq INT DEFAULT 0;
249.
250.DECLARE ws, wns, wt FLOAT(30,20) DEFAULT 0;
251.DECLARE alpha, eps, err, temp_alpha FLOAT(30,20) DEFAULT 0;
252.DECLARE info satisfaction VARCHAR(2);
253.
254.DECLARE prediction INT DEFAULT 0;
255.DECLARE i, testing ke, total training, total testing, i testing,
  i training, total data INT DEFAULT 0;
256.
257. SELECT COUNT(*) INTO total data FROM tbldataprocess;
258.SET testing ke = number of testing;
259.SET maxepoch=5;
260. IF testing ke = 1 THEN SET total training = 0.9 * total data;
261. ELSEIF testing ke = 2 THEN SET total training = 0.75 * total data;
262. ELSEIF testing_ke = 3 THEN SET total_training = 0.5 * total_data;
263. ELSEIF testing_ke = 4 THEN SET total_training = 0.25 * total_data;
264. ELSEIF testing ke = 5 THEN SET total training = 0.1 * total data;
265.END IF;
266. TRUNCATE tbldatatesting;
267. TRUNCATE tbldatatraining;
268.SET total testing = total data-total training;
269.SET i_testing = 1;
270.SET i training = 1;
271. INSERT
             INTO
                    tbldatatraining ( Gender,
                                                   customer type,
  type of travel, customer class, flight distance, inflight wifi service,
  departure arrival time convenient,
                                                  ease of online booking,
  gate location, food and drink,
                                        online boarding, seat comfort,
  inflight entertainment,
                                onboard service,
                                                        leg room service,
  baggage handling, checkin service, inflight service, cleanliness,
  departure_delay_in_minutes, arrival_delay_in_minutes, satisfaction)
```

```
272.SELECT Gender, customer_type, age, type_of_travel, customer_class,
  flight distance,
                                                   inflight wifi service,
  departure_arrival_time_convenient,
                                                  ease of online booking,
                                      online_boarding, seat_comfort,
  gate location, food and drink,
  inflight entertainment, onboard service,
                                                        leg room service,
  baggage handling, checkin service, inflight service, cleanliness,
  departure delay in minutes, arrival delay in minutes, satisfaction
273.FROM tbldataprocess where id<= total training;
275.INSERT INTO tbldatatesting (Gender, customer type, age, type of travel,
  customer class,
                          flight distance,
                                                  inflight wifi service,
  departure arrival time convenient,
                                                  ease of online booking,
  gate location, food and drink, online boarding, seat comfort,
  inflight entertainment,
                               onboard service,
                                                       leg room service,
  baggage handling, checkin service, inflight service,
                                                            cleanliness,
  departure delay in minutes, arrival delay in minutes, satisfaction)
276.SELECT Gender, customer_type, age, type_of_travel, customer_class,
                                                   inflight wifi service,
  flight distance,
  departure_arrival_time_convenient,
                                                  ease of online booking,
  gate location, food and drink, online boarding, seat_comfort,
  inflight entertainment, onboard service, leg room service,
  baggage handling, checkin service,
                                        inflight service,
                                                            cleanliness,
  departure_delay_in_minutes, arrival_delay_in_minutes, satisfaction
277.FROM tbldataprocess WHERE
278.id > total training
279.AND id <= ( total training + total testing);</pre>
281. INSERT
           INTO tblaccuracy(algoritma, testing, total data training,
  total data, total training, tp, tn, fp, fn, tnull, fnull, accuracy)
  VALUES('LVQ', testing_ke,0,0,0,0,0,0,0,0,0,0);
283. -- INITIALITATION
284.SET alpha = pAlpha;
285.SET eps = pEps;
286.
287. SELECT id INTO ids FROM tbldatatraining WHERE satisfaction = 1 ORDER BY
  RAND() LIMIT 1;
288. SELECT id INTO idns FROM tbldatatraining WHERE satisfaction = 0 ORDER
  BY RAND() LIMIT 1;
290. SELECT gender INTO wls FROM tbldatatraining WHERE id=ids;
291.SELECT gender INTO wlns FROM tbldatatraining WHERE id=idns;
292.....
293. SELECT arrival delay in minutes INTO w22s FROM tbldatatraining WHERE
  id=ids;
294. SELECT arrival delay in minutes INTO w22ns FROM tbldatatraining WHERE
  id=idns;
295. -- row used to initialitation is not use again
296.DELETE FROM tbldatatraining WHERE id=ids;
297.DELETE FROM tbldatatraining WHERE id=idns;
299.SET @num := 0;
300.UPDATE tbldatatraining SET id = @num := (@num+1);
301.ALTER TABLE tbldatatraining AUTO INCREMENT =1;
302. -- END INITIALITATION
303.
```

```
304. -- TRAINING
305.SET temp alpha = alpha;
306.WHILE epoch < maxepoch DO
307.SET i training = 0;
308.SET temp i training = 0;
309.SET alpha=temp alpha;
310. algolvq: WHILE (i training <= total training) or (alpha >= eps) DO
311. IF (alpha>=eps) THEN
312. SELECT gender INTO w1t FROM tbldatatraining WHERE id=i_training;
313.
314. SELECT
               satisfaction
                              INTO
                                     w23t
                                            FROM
                                                    tbldatatraining
                                                                      WHERE
  id=i_training;
315.
316. SET ws = ed(w1t, w1s, w2t, w2s, w3t, w3s, w4t, w4s, w5t, w5s, w6t,
  w6s, w7t, w7s, w8t, w8s, w9t, w9s, w10t, w10s, w11t, w11s, w12t, w12s,
  w13t, w13s, w14t, w14s, w15t, w15s, w16t, w16s, w17t, w17s, w18t, w18s,
  w19t, w19s, w20t, w20s, w21t, w21s, w22t, w22s);
317. SET wns = ed(w1t, w1ns, w2t, w2ns, w3t, w3ns, w4t, w4ns, w5t, w5ns,
  w6t, w6ns, w7t, w7ns, w8t, w8ns, w9t, w9ns, w10t, w10ns, w11t, w11ns,
  w12t, w12ns, w13t, w13ns, w14t, w14ns, w15t, w15ns, w16t, w16ns, w17t,
  w17ns, w18t, w18ns, w19t, w19ns, w20t, w20ns, w21t, w21ns, w22t, w22ns);
318.
    IF ws < wns THEN
319.
320.
       SET cj = 1;
321. ELSEIF ws > wns THEN
322.
       SET cj = 0;
323. ELSE
324.
       SET cj = 1;
325.
     END IF;
326.
327.
     SELECT satisfaction INTO t FROM tbldatatraining WHERE id=i training;
328.
      IF cj = 1 AND t = 1 THEN
329.
       SET w1s = w1s + (alpha * (w1t - w1s));
331.
        SET w22s = w22s + (alpha * (w22t - w22s));
332.
333.
     ELSEIF cj = 0 AND t = 0 THEN
334.
        SET wlns = wlns + (alpha * (wlt - wlns));
335.
336.
        SET w22ns = w22ns + (alpha * (w22t - w22ns));
     ELSEIF cj = 0 AND t = 1 THEN
        SET wlns = wlns - (alpha * (wlt - wlns));
338.
339.
340.
        SET w22ns = w22ns - (alpha * (w22t - w22ns));
341.
     ELSEIF cj = 1 AND t = 0 THEN
342.
        SET w1s = w1s - (alpha * (w1t - w1s));
343.
        SET w22s = w22s - (alpha * (w22t - w22s));
344.
345.
     END IF;
346.
347.
     SET alpha = alpha - (alpha * eps);
     UPDATE tblaccuracy SET total data training = i training+1 WHERE
   id=(SELECT COUNT(*) FROM tblaccuracy);
349. SET i training = i training + 1;
350. SET temp i training = i training;
     IF (i training = total training) THEN
```

```
SET temp alpha = alpha;
352.
353.
       SET alpha = eps;
354.
     ELSEIF (alpha <= eps) THEN
355.
        SET temp alpha = alpha;
356.
        SELECT alpha as 'alphaa', i training as 't';
357.
        SET i training = total training +1;
358.
     END IF;
359. ELSE
360.
       LEAVE algolvq;
361. END IF;
362. END WHILE;
363.
       SET epoch = epoch + 1;
364. IF (temp i training <> 0) THEN
365.
       SET ptotal data training=ptotal data training + temp i training;
366.
       SET pepoch=epoch;
367.
     END IF;
368. END WHILE;
369. WHILE i testing <= total testing DO
370. SELECT gender INTO w1t FROM tbldatatesting WHERE id=i testing;
372. SELECT arrival delay in minutes INTO w22t FROM tbldatatesting WHERE
   id=i testing;
373. SELECT satisfaction INTO w23t FROM tbldatatesting WHERE id=i testing;
374.
375. SET ws = ed(w1t, w1s, w2t, w2s, w3t, w3s, w4t, w4s, w5t, w5s, w6t,
  w6s, w7t, w7s, w8t, w8s, w9t, w9s, w10t, w10s, w11t, w11s, w12t, w12s,
  w13t, w13s, w14t, w14s, w15t, w15s, w16t, w16s, w17t, w17s, w18t, w18s,
  w19t, w19s, w20t, w20s, w21t, w21s, w22t, w22s);
377. SET wns = ed(w1t, w1ns, w2t, w2ns, w3t, w3ns, w4t, w4ns, w5t, w5ns,
  w6t, w6ns, w7t, w7ns, w8t, w8ns, w9t, w9ns, w10t, w10ns, w11t, w11ns,
  w12t, w12ns, w13t, w13ns, w14t, w14ns, w15t, w15ns, w16t, w16ns, w17t,
  w17ns, w18t, w18ns, w19t, w19ns, w20t, w20ns, w21t, w21ns, w22t, w22ns);
378.
     SELECT satisfaction INTO info satisfaction FROM tbldatatesting WHERE
   id=i testing;
380. IF ws < wns THEN SET prediction = 1;
       ELSEIF ws > wns THEN SET prediction = 0;
381.
382.
       ELSE SET prediction = 1;
383. END IF;
384. IF info satisfaction = 0 AND prediction=0 THEN
       SET tn lvq=tn lvq+1;
385.
     ELSEIF info_satisfaction = 0 AND prediction=1 THEN
386.
387.
       SET fp lvq=fp lvq+1;
388.
     ELSEIF info satisfaction = 1 AND prediction=0 THEN
389.
       SET fn lvq=fn lvq+1;
390.
    ELSEIF info satisfaction = 1 AND prediction=1 THEN
391.
       SET tp_lvq=tp_lvq+1;
392. END IF;
     SET i testing = i testing + 1;
394.END WHILE;
395.
396.UPDATE tblaccuracy SET total data=total testing, tn=tn lvq, fp=fp lvq,
   fn=fn lvq, tp=tp lvq WHERE id = (SELECT count(*) FROM tblaccuracy);
397.END ##
398.DELIMITER ;
```

Lines 236-398 are the procedures in which the LVQ algorithm is executed. This procedure has 3 parameters, namely testing to how much, alpha and eps. The first parameter is used to determine the distribution of the amount of training and testing data. While alpha and eps are used to simplify the analysis by replacing the two values.

Line 240 is a variable declaration for label weight 1 while 242 is for label weight 2. In line 244 is a variable for the value of the input weight. Next 245-255 is the variable declaration used in the lvq procedure.

Lines 257-265 are for dividing the amount of training data and testing data. Furthermore, on lines 266-279 will enter the data from tbldataprocess into tbldatatraining and tbldatatesting the amount that has been obtained earlier. After dividing the data, then entering the data into tblaccuracy for testing that is being carried out on line 281.

Then do the initialization step as in line 283-302. Initial weights for label 0 and label 1 are chosen randomly as in lines 287-288. Then enter into the variables for the 22 input attributes of the two classes as in lines 290-294. After being stored in the data variable that has been used as the initial weight, it is deleted on lines 296-297. the id from tbldatatraining is updated again so that no id jumps because it has been deleted as in lines 299-301.

In lines 305-351 do repetitions for the training process. At each repetition of the training process, the Euclidian distance value for labels 0 and 1 is searched using the ed function as in lines 306-311. After that, the prediction result (J) is determined by looking for the minimum value in lines 313-319. After that the weight value will be updated on lines 321-339. After updating the weights, the alpha value is also updated on line 341. In lines 343-349 it is used to make the loop condition false and exit the loop.

After completing the training repetition, the final weight of the training is obtained. These weights will be used in the iteration of lines 352-377 which is the iteration for all testing data from tbldatatesting. In each of these iterations get the input values as in lines 353-356 for all input attributes. After that, look for the value of the Euclidian distance for the two labels as in lines 358-360. The minimum value of the two Euclidian distances is the prediction result. The value of tn, fp, fn or tp will be added by 1 if it is in accordance with the provisions. After adding this value, it will then repeat for the next testing data until all the data is tested. The final results of tn, fp, fn and tp will be updated to tblaccuracy.

```
399.DELIMITER ##
400.CREATE PROCEDURE processl(alpha FLOAT(30,20), eps FLOAT(30,20))
401.BEGIN
402. CALL lvq(1,alpha,eps);
403. CALL lvq(2,alpha,eps);
404. CALL lvq(3,alpha,eps);
405. CALL lvq(4,alpha,eps);
406. CALL lvq(5,alpha,eps);
407. UPDATE tblaccuracy SET accuracy = ((tp+tn)/(tp+tn+fp+fn))*100 WHERE algoritma="LVQ";
408.END ##
409.DELIMITER;
```

In lines 382-392 this is a procedure to run the lvq procedure 5 times. After 5 tests with different amounts of training and testing data, the accuracy value will be calculated as in line 390.

```
410.DELIMITER ##
411. CREATE PROCEDURE process()
412.BEGIN
413. CALL processb();
414. CALL process1(0.9,0.0000001);
415. CALL process1(0.9,0.0001);
416. CALL process1(0.9,0.01);
417. CALL process1(0.1,0.0000001);
418. CALL process1(0.1,0.0001);
419. CALL process1(0.1,0.01);
420. CALL process1(0.01,0.0000001);
421. CALL process1(0.01,0.0001);
422. CALL process1(0.05,0.0000001);
423. CALL process1(0.05,0.0001);
424.END ##
425.DELIMITER ;
```

On lines 393-408 these are Naive Bayes and LVQ procedures. On line 396 run the procedure process which will perform all 5 Naive Bayes tests. Next it will run the 5 LVQ tests by calling the process procedure. In running the process, it is done several times with different alpha and eps values.

5.2. Results

From the results of the trials that have been carried out, Naive Bayes and LVQ can be used to determine airline passenger satisfaction. The results of the trial run for almost 4 days. The longest test run when running Naive Bayes is around 3 days and 3 hours. The results of the program that runs the Naive Bayes algorithm are as follows:

Table 5.1. Naive Bayes Results

| Test | TP | TN | FP | FN | Tnull | Fnull | Accuracy |
|------|------|------|-----|-----|-------|-------|----------|
| 1 | 4992 | 6485 | 756 | 716 | 0 | 0 | 88.63% |

| 2 | 12438 | 1822 | 1822 | 1735 | 0 | 0 | 89.01% |
|---|-------|------|------|------|---|----|--------|
| 3 | 24728 | 3565 | 3565 | 3433 | 0 | 0 | 89.18% |
| 4 | 37089 | 5427 | 5427 | 5039 | 1 | 0 | 89.22% |
| 5 | 44629 | 6444 | 6444 | 5965 | 1 | 10 | 89.34% |

From the table above, Naive Bayes can determine quite a lot of predictions that match the original class. This can be seen from the accuracy obtained between the range of 88-89%. The average of this test is 89.076%. However, in tests 4 and 5 there are some testing data whose prediction results are unknown. This is probably due to the large number of input attributes, namely 22 attributes, when multiplied all the results cannot be saved by the computer. Because the program can only store a maximum of 30 digits behind the comma. So it is possible that the result is 0.0 for both predictions and no conclusions can be drawn from the prediction results.

Furthermore, the LVQ algorithm can also be implemented for this airline's passenger satisfaction data. Because there are alpha and eps parameters that do not have an exact value, this study tries to use several kinds of values. For the alpha value, try 4 variations of the value, namely 0.9; 0.1; 0.01; and 0.05. While for eps there are only 3 variations, namely 0.0000001; 0.0001; and 0.01. The results of the LVQ implementation of these variations are shown in the tables below.

Table 5.2. Results LVQ Alpha 0.9 and Eps 0.0000001, 0.0001, 0.01

| Test | TP | TN | FP | FN | Accuracy |
|------|----|-------|----|-------|----------|
| 1 | 0 | 7421 | 0 | 5708 | 55.92% |
| 2 | 0 | 18198 | 0 | 14173 | 56.22% |
| 3 | 0 | 36572 | 0 | 28171 | 56.49% |
| 4 | 0 | 54985 | 0 | 42129 | 56.62% |
| 5 | 0 | 65942 | 0 | 50595 | 56.58% |

Table 5.3. Results LVQ Alpha 0.1 and Eps 0.0000001

| Test | TP | TN | FP | FN | Accuracy |
|------|-------|-------|-------|------|----------|
| 1 | 3802 | 6406 | 835 | 1906 | 78.83% |
| 2 | 10893 | 14777 | 3421 | 3280 | 79.30% |
| 3 | 22117 | 28842 | 7730 | 6054 | 79.71% |
| 4 | 34469 | 40371 | 14614 | 7660 | 77.06% |
| 5 | 42421 | 47930 | 18012 | 8174 | 77.53% |

Table 5.4. Results LVQ Alpha 0.1 and Eps 0.0001

| Test | TP | TN | FP | FN | Accuracy |
|------|-------|-------|------|------|----------|
| 1 | 4405 | 5841 | 1400 | 1303 | 79.13% |
| 2 | 10963 | 14652 | 3546 | 3210 | 79.13% |

| 3 | 21824 | 29496 | 7076 | 6347 | 79.27% |
|---|-------|-------|-------|-------|--------|
| 4 | 33133 | 43881 | 11104 | 8996 | 79.30% |
| 5 | 39977 | 52072 | 13870 | 10618 | 78.99% |

Table 5.5. Results LVQ Alpha 0.1 and Eps 0.01

| Test | TP | TN | FP | FN | Accuracy |
|------|-------|-------|-------|-------|----------|
| 1 | 4412 | 5904 | 1337 | 1296 | 79.67% |
| 2 | 9998 | 15383 | 2815 | 4175 | 78.41% |
| 3 | 21823 | 29752 | 6820 | 6348 | 79.66% |
| 4 | 31784 | 45028 | 9957 | 10345 | 79.09% |
| 5 | 38662 | 54703 | 11239 | 11933 | 80.12% |

Table 5.6. Results LVQ Alpha 0.01 and Eps 0.0000001

| Test | TP | TN | FP | FN | Accuracy |
|------|-------|-------|-------|-------|----------|
| 1 | 4252 | 6041 | 1200 | 1456 | 79.49% |
| 2 | 10910 | 14788 | 3410 | 3263 | 79.39% |
| 3 | 21900 | 29310 | 7262 | 6271 | 79.10% |
| 4 | 33299 | 43552 | 11433 | 8830 | 79.13% |
| 5 | 39884 | 51750 | 14192 | 10711 | 78.63% |

Table 5.7. Results LVQ Alpha 0.01 and Eps 0.0001

| Test | TP | TN | FP | FN | Accuracy |
|------|-------|-------|-------|-------|----------|
| 1 | 4414 | 5825 | 1416 | 1294 | 79.07% |
| 2 | 10984 | 14616 | 3582 | 3189 | 79.08% |
| 3 | 21869 | 29452 | 7120 | 6302 | 79.27% |
| 4 | 32772 | 44270 | 10715 | 9357 | 79.33% |
| 5 | 39688 | 52322 | 13620 | 10907 | 78.95% |

Table 5.8. Results LVQ Alpha 0.05 and Eps 0.0000001

| Test | TP | TN | FP | FN | Accuracy | |
|------|-------|-------|-------|------|----------|--|
| 1 | 3797 | 6522 | 719 | 1911 | 79.69% | |
| 2 | 10809 | 14977 | 3221 | 3364 | 79.66% | |
| 3 | 21713 | 29818 | 6754 | 6458 | 79.59% | |
| 4 | 33943 | 41848 | 13137 | 8186 | 78.04% | |
| 5 | 40709 | 51609 | 14333 | 9886 | 79.22% | |

Table 5.9. Results LVQ Alpha 0.05 and Eps 0.0001

| Test | TP | TN | FP | FN | Accuracy |
|------|-------|-------|-------|-------|----------|
| 1 | 4407 | 5843 | 1398 | 1301 | 79.16% |
| 2 | 10964 | 14657 | 3541 | 3209 | 79.15% |
| 3 | 21824 | 29522 | 7050 | 6347 | 79.31% |
| 4 | 32969 | 44054 | 10931 | 9160 | 79.31% |
| 5 | 39887 | 51730 | 14212 | 10708 | 78.62% |

Of the 10 variations and each variation remains 5 times the results of the accuracy test also vary. In table 5.2 where alpha 0.9 and different eps the prediction results and accuracy have the same value even though the eps is changed. The average accuracy is 56.366%. But if you look at the Tp values, all are 0. This means that testing with an alpha of 0.9 will produce all "neutral or dissatisfied" predictions. Of course it cannot be said to be predicting the outcome because 100% of the predicted results are labeled "neutral or dissatisfied". However, when alpha 0.1 results are quite good, this result can be said to be predicting the label. From the experiments that have been done, the best results are when alpha 0.1 and eps 0.01. The average accuracy is 79.39%. Because the average accuracy is the best, it will be used when compared to the Naive Bayes algorithm.

So, if based on the accuracy value, Naive Bayes is better than LVQ where Naive Bayes has an average accuracy of 89.076% while LVQ is 79.39%. However, from the experimental results, the drawback of Naive Bayes is the processing time for the 5 tests, which is more than 3 days. Meanwhile, the LVQ for 5 tests with training and testing data differs by an average of 30 minutes. However, it is necessary to find the optimal value for LVQ through alpha and eps values.

If the results of the accuracy of the LVQ algorithm in graphical form will be as below.

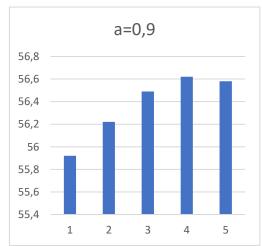


Figure 5.1 Graph of accuracy LVQ alpha=0.9

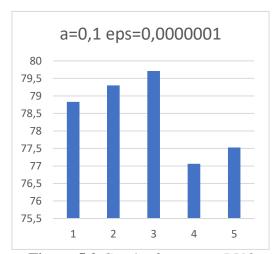


Figure 5.2 Graph of accuracy LVQ alpha=0.1 and eps=0.0000001

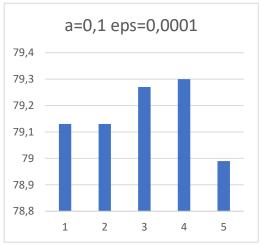


Figure 5.3 Graph of accuracy LVQ alpha=0.1 and eps=0.0001

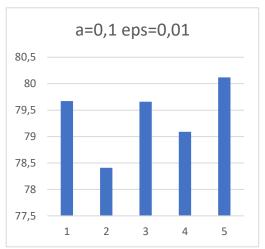


Figure 5.4 Graph of accuracy alpha=0.1 and eps=0.01

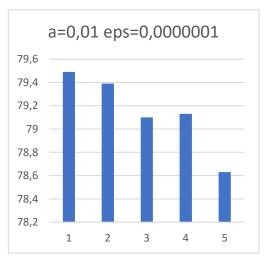


Figure 5.5 Graph of accuracy alpha=0.01 and eps=0.0000001

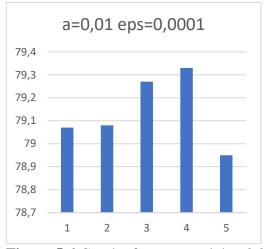


Figure 5.6 Graph of accuracy alpha=0.01 and eps=0.0001

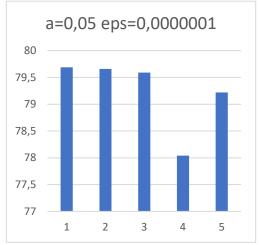


Figure 5.7 Graph of accuracy alpha=0.05 and eps=0.0000001

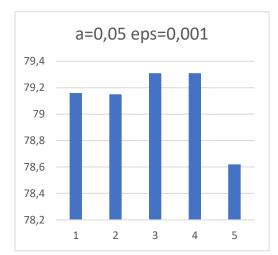


Figure 5.8 Graph of accuracy alpha=0.05 and eps=0.0001

When viewed from each graph of the accuracy of the LVQ algorithm, it has a different curve. This is of course because of the influence of the alpha and eps values. But it is possible because of the quality of the data itself.

CHAPTER 6 CONCLUSION

Based on the results of the tests that have been carried out, the following conclusions can be drawn:

- 1. Naive Bayes can be used to classify airline passenger satisfaction. It is proven that the Naive Bayes algorithm can be implemented for customer satisfaction data obtained through Kaggle.
- 2. Learning Vector Quantization can also classify airline passenger satisfaction. This is because this algorithm can be implemented on the same data to implement Naive Bayes.
- 3. Of the two algorithms, Naive Bayes is better at classifying airline passenger satisfaction than Learning Vector Quantization. This is based on the average accuracy of the two algorithms. Naive Bayes has an average accuracy of 89.076% while the LVQ is 79.39%.

Suggestions for further research is to focus on one algorithm, namely Learning Vector Quantization (LVQ). From the results of the study, with an alpha of 0.9 and different eps produce the same result. However, some tests with other alphas, namely 0.1, 0.01, and 0.05 produced different results when the eps were changed. With the same data, LVQ is implemented but with the aim of finding the most optimal value. The combination of alpha and eps at the most optimal so that it can get the best accuracy for this airline's flight satisfaction data.

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APPENDIX

CODING TABLE DATA

```
426. DROP DATABASE IF EXISTS dbaps;
427. CREATE DATABASE dbaps;
428. USE dbaps;
429.
430. DROP TABLE IF EXISTS tbldata;
431. CREATE TABLE tbldata(
432.
         id INT PRIMARY KEY AUTO INCREMENT
433.
         , Gender VARCHAR (10)
         , customer type varchar(50)
434.
435.
         , age varchar(10)
436.
         , type of travel VARCHAR(50)
437.
         , customer class VARCHAR(50)
         , flight_distance varchar(10)
438.
439.
         , inflight_wifi_service varchar(10)
440.
         , departure arrival time convenient varchar(10)
         , ease of online booking varchar(10)
441.
442.
         , gate location varchar(10)
443.
         , food and drink varchar(10)
444.
         , online boarding varchar(10)
445.
         , seat comfort varchar(10)
446.
         , inflight entertainment varchar(10)
447.
         , onboard service varchar(10)
         , leg_room_service varchar(10)
448.
449.
         , baggage handling varchar(10)
         , checkin_service varchar(10)
450.
451.
         , inflight_service varchar(10)
452.
         , cleanliness varchar(10)
453.
         , departure delay in minutes varchar(10)
         , arrival_delay_in_minutes varchar(10)
454.
         , satisfaction VARCHAR(50)
456. ) engine=InnoDB;
457.
458. LOAD DATA LOCAL INFILE 'airline passenger satisfaction.csv'
459.
         INTO TABLE tbldata
460.
         FIELDS TERMINATED BY ','
461.
         ENCLOSED BY ''
462.
         LINES TERMINATED BY '\n'
463.
         IGNORE 1 LINES
464.
         (id,
                  Gender,
                              customer type,
                                                age,
                                                         type of travel,
customer_class,
         flight distance,
                                                  inflight wifi service,
departure arrival time convenient,
         ease of online booking,
                                      gate location,
                                                         food and drink,
online boarding,
                           inflight entertainment,
467.
         seat comfort,
                                                        onboard service,
leg room service,
         baggage handling,
                                checkin service,
                                                       inflight service,
cleanliness,
469.
         departure delay in minutes,
                                               arrival delay in minutes,
satisfaction)
470.
         SET
```

```
471.
             Gender = IF(Gender = '', null, Gender)
                 customer_type = IF(customer type = '',
472.
                                                                 null,
customer type)
473.
             , age = IF(age = '', null, age)
                                     IF(type_of_travel
474.
                 type of travel =
                                                            11,
                                                                 null,
type of travel)
                 customer class =
                                     IF(customer class
                                                            '',
                                                                 null,
customer class)
                flight distance = IF(flight distance = '', null,
476.
flight distance)
477.
             , inflight_wifi_service = IF(inflight_wifi_service = '',
null, inflight_wifi_service)
                         departure arrival time convenient
IF (departure arrival time convenient
                                                                 null,
departure arrival time convenient)
             , ease of online booking = IF(ease of online booking = '',
null, ease_of_online_booking)
480.
                 gate location
                                     IF(gate location =
                                 =
                                                                 null,
gate location)
481.
                 food and drink =
                                     IF(food and drink = '',
food and drink)
                online boarding = IF(online boarding = '', null,
online boarding)
             , seat comfort = IF(seat comfort = '', null, seat comfort)
483.
484.
             , inflight entertainment = IF(inflight entertainment = '',
null, inflight entertainment)
                onboard service = IF(onboard service = '', null,
onboard service)
             , leg room service = IF(leg room service = '', null,
486.
leg room service)
              , baggage handling =
                                     IF(baggage handling = '', null,
baggage_handling)
                                     IF(checkin service = '',
                checkin service =
                                                                 null,
checkin service)
               inflight service = IF(inflight service = '', null,
inflight service)
             , cleanliness = IF(cleanliness = '', null, cleanliness)
490.
491.
                             departure_delay_in_minutes
IF(departure delay in minutes = '', null, departure delay in minutes)
             , arrival delay in minutes = IF(arrival delay in minutes =
'', null, arrival delay in minutes)
             , satisfaction = IF(satisfaction = '', null, satisfaction)
493.
494.
495.
496. INSERT INTO tbldataprocess
497. SELECT * FROM tbldata
```

CODING TABLE DATA PROCESS

```
498.DROP TABLE IF EXISTS tbldataprocess;
499.CREATE TABLE tbldataprocess(
500. id INT PRIMARY KEY
501. , Gender VARCHAR(10)
502. , customer_type varchar(50)
503. , age INT
504. , type of travel VARCHAR(50)
```

```
505.
        , customer class VARCHAR(50)
506.
       , flight distance INT
507.
       , inflight wifi service INT
508.
      , departure arrival time convenient INT
      , ease of online booking INT
509.
       , gate_location INT
510.
       , food_and_drink INT
511.
      , online_boarding INT
512.
      , seat_comfort INT
513.
      , inflight_entertainment INT
514.
515.
      , onboard_service INT
516.
      , leg_room_service INT
      , baggage_handling INT
517.
       , checkin_service INT
518.
      , {	t inflight\_service} INT
519.
520.
       , cleanliness INT
521.
        , departure_delay_in_minutes INT
522.
       , arrival delay in minutes INT
       , satisfaction VARCHAR(50)
524.) engine=InnoDB;
526.INSERT INTO tbldataprocess
527. SELECT * FROM tbldata
528.;
```

PROCEDURE PREPROCESSING

```
    DROP PROCEDURE IF EXISTS preprocessing;

2. DELIMITER ##
       CREATE PROCEDURE preprocessing()
3.
4.
       BEGIN
       DECLARE i, iwhile, spinformation int INT DEFAULT 0;
       DECLARE nama, spinformation, spinformation2 VARCHAR(255);
7.
8.
       DELETE FROM tbldataprocess
9.
       WHERE
10.
              Gender IS NULL or
11.
              customer type IS NULL or
12.
              age IS NULL or
13.
              type of travel IS NULL or
14.
              customer class IS NULL or
              flight distance IS NULL or
15.
              inflight wifi service IS NULL or
16.
              departure arrival time convenient IS NULL or
17.
18.
              ease_of_online_booking IS NULL or
19.
              gate location IS NULL or
20.
              food and drink IS NULL or
21.
              online boarding IS NULL or
22.
              seat comfort IS NULL or
23.
              inflight entertainment IS NULL or
24.
              onboard service IS NULL or
25.
              leg_room_service IS NULL or
26.
              baggage_handling IS NULL or
27.
              checkin service IS NULL or
28.
              inflight service IS NULL or
29.
              cleanliness IS NULL or
```

```
30.
             departure_delay_in_minutes IS NULL or
             arrival delay in minutes IS NULL or
31.
32.
             satisfaction IS NULL
33.
          ;
34.
35.
         SET @num := 0;
36.
         UPDATE tbldataprocess SET id = @num := (@num+1);
37.
         ALTER TABLE tbldataprocess AUTO INCREMENT =1;
38.
39.
         -- GENDER
40.
         SELECT count(DISTINCT gender) into i from tbldataprocess;
41.
         SET iwhile = 0;
42.
         WHILE iwhile<>i DO
             SELECT
                       DISTINCT
                                  gender
                                            INTO
                                                   spinformation
                                                                    FROM
   tbldataprocess order by gender ASC limit iwhile, 1;
44.
             UPDATE
                       tbldataprocess
                                         set
                                                 gender=iwhile
                                                                   where
   gender=spinformation;
45.
         set iwhile= iwhile +1;
46.
         END WHILE ;
47.
48.
         -- Customer Type
                   count (DISTINCT
                                     customer type)
         SELECT
                                                               i
                                                                    from
                                                       into
  tbldataprocess;
50.
         SET iwhile = 0;
51.
         WHILE iwhile <> i DO
             SELECT DISTINCT customer type INTO spinformation FROM
   tbldataprocess order by customer type ASC limit iwhile, 1;
             UPDATE
                      tbldataprocess set customer type=iwhile where
   customer type=spinformation;
54.
         set iwhile= iwhile +1;
55.
         END WHILE ;
56.
57.
         -- AGE
58.
         UPDATE tbldataprocess set age=0 where age <= 27;
59.
         UPDATE tbldataprocess set age=1 where age > 27 and age <= 51;
         UPDATE tbldataprocess set age=2 where age > 51;
60.
61.
62.
         -- Type Of Travel
         SELECT
                   count (DISTINCT
                                   type of travel)
                                                               i
                                                       into
                                                                    from
  tbldataprocess;
64.
         SET iwhile = 0;
65.
         WHILE iwhile <> i DO
             SELECT DISTINCT type of travel INTO spinformation FROM
   tbldataprocess order by type of travel ASC limit iwhile, 1;
67.
             UPDATE tbldataprocess set type_of_travel=iwhile where
   type of travel=spinformation;
68.
         set iwhile= iwhile +1;
69.
         END WHILE ;
70.
71.
          -- Customer Class
         SELECT
                 count (DISTINCT
                                     customer class)
                                                       into
                                                                    from
   tbldataprocess;
73.
         SET iwhile = 0;
74.
         WHILE iwhile <> i DO
75.
             SELECT DISTINCT customer class into spinformation FROM
   tbldataprocess order by customer class ASC limit iwhile, 1;
```

```
UPDATE tbldataprocess set customer_class=iwhile where
  customer class=spinformation;
77. set iwhile= iwhile +1;
        END WHILE ;
78.
79.
80.
        -- FLIGHT DISTANCE
       UPDATE tbldataprocess set flight_distance=0
                                                             where
 flight distance <= 414;</pre>
82. UPDATE tbldataprocess set flight distance=1
                                                             where
 flight distance > 414 && flight distance <= 1744;
        UPDATE tbldataprocess set flight distance=2
                                                             where
  flight distance > 1744;
84.
85.
        -- Inflight Wifi Service
       SELECT count(DISTINCT inflight wifi service) into i from
 tbldataprocess;
87.
    SET iwhile = 0;
88.
        WHILE iwhile <> i DO
            SELECT DISTINCT inflight wifi service
89.
                                                              into
  spinformation int FROM tbldataprocess order by inflight wifi service
  ASC limit iwhile, 1;
      set iwhile= iwhile +1;
        END WHILE;
91.
92.
93.
        -- Departure Arrival Time Convenient
        SELECT count(DISTINCT departure arrival time convenient) into
 i from tbldataprocess;
      SET iwhile = 0;
95.
96.
        WHILE iwhile <> i DO
97.
            SELECT DISTINCT departure arrival time convenient into
  spinformation int FROM
                               tbldataprocess
  departure arrival time convenient ASC limit iwhile, 1;
98. set iwhile= iwhile +1;
99.
       END WHILE;
100.
        -- Ease of Online Booking
101.
        SELECT count(DISTINCT ease_of_online_booking) into i from
  tbldataprocess;
103. SET iwhile = 0;
104.
        WHILE iwhile <> i DO
            SELECT DISTINCT ease of online booking
  spinformation int FROM tbldataprocess order by ease of online booking
  ASC limit iwhile, 1;
106. set iwhile= iwhile +1;
107.
        END WHILE;
108.
109.
        -- Gate Location
        SELECT count(DISTINCT gate location) into i from
  tbldataprocess;
111. SET iwhile = 0;
112.
        WHILE iwhile <> i DO
        SELECT DISTINCT gate location into spinformation int FROM
 tbldataprocess order by gate location ASC limit iwhile, 1;
114. set iwhile= iwhile +1;
115.
        END WHILE;
116.
```

```
117.
        -- Food and Drink
118.
        SELECT
                  count(DISTINCT food and drink)
                                                      into i
                                                               from
  tbldataprocess;
119.
      SET iwhile = 0;
120.
         WHILE iwhile <> i DO
121.
             SELECT DISTINCT food and drink into spinformation int FROM
  tbldataprocess order by food and drink ASC limit iwhile, 1;
        set iwhile= iwhile +1;
123.
         END WHILE;
124.
125.
         -- Online Boarding
126.
         SELECT
                count (DISTINCT
                                   online boarding) into i from
  tbldataprocess;
127.
        SET iwhile = 0;
128.
         WHILE iwhile <> i DO
129.
             SELECT DISTINCT online boarding into spinformation int FROM
   tbldataprocess order by online boarding ASC limit iwhile, 1;
130.
        set iwhile= iwhile +1;
131.
         END WHILE;
132.
133.
         -- Seat Comfort
         SELECT count (DISTINCT seat comfort) into i from tbldataprocess;
134.
135.
         SET iwhile = 0;
         WHILE iwhile <> i DO
136.
137.
             SELECT DISTINCT seat comfort into spinformation int FROM
  tbldataprocess order by seat comfort ASC limit iwhile, 1;
138. set iwhile= iwhile +1;
        END WHILE;
139.
140.
141.
         -- Inflight Enterteinment
         SELECT count(DISTINCT inflight entertainment) into i from
  tbldataprocess;
143. SET iwhile = 0;
144.
         WHILE iwhile <> i DO
145.
             SELECT
                       DISTINCT
                                     inflight entertainment
   spinformation int FROM tbldataprocess order by inflight_entertainment
  ASC limit iwhile, 1;
146.
        set iwhile= iwhile +1;
147.
        END WHILE;
148.
         -- Onboard Service
149.
                                   onboard service) into i from
        SELECT
                  count (DISTINCT
   tbldataprocess;
151.
      SET iwhile = 0;
152.
         WHILE iwhile <> i DO
153.
             SELECT DISTINCT onboard service into spinformation int FROM
   tbldataprocess order by onboard service ASC limit iwhile, 1;
154.
      set iwhile= iwhile +1;
         END WHILE;
155.
156.
157.
         -- Leg Room Service
                                   leg_room_service) into i from
         SELECT count (DISTINCT
  tbldataprocess;
159. SET iwhile = 0;
```

WHILE iwhile <> i DO

160.

```
161.
             SELECT DISTINCT leg_room_service into spinformation_int
   FROM tbldataprocess order by leg room service ASC limit iwhile, 1;
162.
      set iwhile= iwhile +1;
163.
         END WHILE;
164.
165.
         -- Baggage Handling
         SELECT
                 count (DISTINCT
                                   baggage handling)
                                                       into i from
  tbldataprocess;
        SET iwhile = 0;
167.
168.
         WHILE iwhile <> i DO
             SELECT DISTINCT baggage_handling into spinformation_int
  FROM tbldataprocess order by baggage handling ASC limit iwhile, 1;
170. set iwhile= iwhile +1;
171.
         END WHILE;
172.
173.
         -- Checkin Service
         SELECT
                 count (DISTINCT
                                  checkin service)
                                                    into i
                                                                from
   tbldataprocess;
175. SET iwhile = 0;
176.
         WHILE iwhile <> i DO
             SELECT DISTINCT checkin service into spinformation int FROM
  tbldataprocess order by checkin service ASC limit iwhile, 1;
178. set iwhile= iwhile +1;
179.
         END WHILE;
180.
181.
         -- Inflight Service
182
         SELECT
                  count (DISTINCT
                                   inflight service)
                                                       into i from
   tbldataprocess;
183.
        SET iwhile = 0;
184.
         WHILE iwhile <> i DO
             SELECT DISTINCT inflight_service into spinformation_int
   FROM tbldataprocess order by inflight service ASC limit iwhile, 1;
186. set iwhile= iwhile +1;
187.
         END WHILE;
188.
         -- Cleanliness
189.
         SELECT count(DISTINCT cleanliness) into i from tbldataprocess;
190.
191.
         SET iwhile = 0;
192.
         WHILE iwhile <> i DO
             SELECT DISTINCT cleanliness into spinformation int FROM
193.
  tbldataprocess order by cleanliness ASC limit iwhile, 1;
194.
        set iwhile= iwhile +1;
         END WHILE;
195.
196.
197.
         -- Departure Delay In Minutes
         UPDATE tbldataprocess set departure delay in minutes=0 where
   departure delay in minutes <= 12;</pre>
         UPDATE tbldataprocess set departure delay in minutes=1 where
   departure_delay_in_minutes > 12;
200.
201.
         -- Arrival Delay In Minutes
202.
         UPDATE tbldataprocess set arrival delay in minutes=0 where
   arrival delay in minutes <= 13;</pre>
         UPDATE tbldataprocess set arrival delay in minutes=1 where
   arrival delay in minutes > 13;
204.
```

```
205.
        -- Satisfaction
206.
         SELECT count (DISTINCT satisfaction) into i from tbldataprocess;
207.
         SET iwhile = 0;
208.
         WHILE iwhile <> i DO
             SELECT DISTINCT satisfaction into spinformation FROM
209
  tbldataprocess order by satisfaction ASC limit iwhile, 1;
             UPDATE tbldataprocess set satisfaction=iwhile
                                                                 where
  satisfaction=spinformation;
211.
      set iwhile= iwhile +1;
212.
         END WHILE ;
213.
214.
         END ##
215. DELIMITER;
216.
217. CALL preprocessing();
```

CODING TABLE TO TESTING

```
    DROP TABLE IF EXISTS tbldatatraining;

CREATE TABLE tbldatatraining(
       id INT PRIMARY KEY AUTO INCREMENT
4.
       , Gender VARCHAR(10)
5.
       , customer type varchar(50)
6.
       , age INT
7.
      , type_of_travel VARCHAR(50)
      , customer_class VARCHAR(50)
8.
9.
       , flight distance INT
         , inflight_wifi service INT
10.
         , departure_arrival_time_convenient INT
11.
         , ease_of_online_booking INT
12.
13.
         , gate_location INT
         , food_and_drink INT
14.
15.
         , online_boarding INT
16.
         , seat comfort INT
         , inflight_entertainment INT
17.
18.
         , onboard_service INT
         , leg_room service INT
19.
         , baggage handling INT
20.
         , checkin_service INT
21.
22.
         , inflight service INT
23.
         , cleanliness INT
          , departure delay in minutes INT
24.
25.
          , arrival delay in minutes INT
26.
          , satisfaction VARCHAR(50)
27.
     ) engine=InnoDB;
28.
29. DROP TABLE IF EXISTS tbldatatesting;
CREATE TABLE tbldatatesting(
31.
         id INT PRIMARY KEY AUTO INCREMENT
32.
         , Gender VARCHAR(10)
33.
         , customer type varchar(50)
         , age INT
34.
35.
         , type_of_travel VARCHAR(50)
36.
         , customer_class VARCHAR(50)
         , flight distance INT
37.
38.
          , inflight wifi service INT
```

```
, departure_arrival_time_convenient INT
39.
40.
          , ease of online booking INT
          , gate location INT
41.
          , food and drink INT
42.
         , online boarding INT
43.
44.
         , seat comfort INT
         , inflight_entertainment INT
45.
         , onboard_service INT
46.
         , leg_room_service INT
47.
48.
         , baggage_handling INT
49.
         , checkin_service INT
         , inflight_service INT
50.
51.
          , cleanliness INT
52.
          , departure_delay_in_minutes INT
53.
          , arrival delay in minutes INT
54.
          , satisfaction VARCHAR(50)
          , prediksi VARCHAR(255)
55.
56.
     ) engine=InnoDB;
57.
58.
59. CREATE TABLE tblaccuracy (
60.
         id INT PRIMARY KEY AUTO INCREMENT
          , algoritma VARCHAR(15)
61.
          , testing INT
62.
63.
         , total data training INT
64.
         , total data INT
          , total_training INT
65.
66.
          , tp INT
67.
          , tn INT
68.
          , fp INT
69.
         , fn INT
70.
         , tnull INT
          , fnull INT
71.
          , accuracy FLOAT(4,2)
72.
73.
    );
74.
    CREATE TABLE tblW(
75.
         id INT PRIMARY KEY AUTO INCREMENT
76.
          ,testing INT
77.
78.
          ,alpha FLOAT(30,20)
         ,eps FLOAT(30,20)
79.
         ,w1 FLOAT(30,20)
80.
         ,w2 FLOAT (30,20)
81.
         ,w3 FLOAT(30,20)
82.
         ,w4 FLOAT(30,20)
83.
84.
         ,w5 FLOAT(30,20)
85.
         ,w6 FLOAT(30,20)
         ,w7 FLOAT(30,20)
86.
87.
         ,w8 FLOAT(30,20)
88.
         ,w9 FLOAT (30,20)
         ,w10 FLOAT(30,20)
89.
         ,w11 FLOAT(30,20)
90.
91.
         ,w12 FLOAT(30,20)
92.
         ,w13 FLOAT(30,20)
93.
         ,w14 FLOAT(30,20)
94.
         ,w15 FLOAT(30,20)
```

```
95.
         ,w16 FLOAT(30,20)
96.
          ,w17 FLOAT(30,20)
         ,w18 FLOAT(30,20)
97.
         ,w19 FLOAT(30,20)
98.
99
         ,w20 FLOAT (30,20)
100.
         ,w21 FLOAT(30,20)
          ,w22 FLOAT (30,20)
101.
102.
          ,w23 FLOAT (30,20)
103.);
```

PROCEDURE NAÏVE BAYES

```
    DROP PROCEDURE IF EXISTS bayesian;

      DELIMITER ##
3.
       CREATE PROCEDURE bayesian (number of testing INT)
4.
       -- CREATE PROCEDURE bayesian()
5.
           -- prob = probability
6.
7.
           DECLARE
8.
               prob satisfied,
                                 prob gender s, prob customer type s,
   prob age s, prob type of travel s, prob customer class s
9.
              , prob flight distance s, prob inflight wifi service s,
   prob departure arrival time convenient s,
   prob_ease_of_online_booking s
                        prob gate location s,
                                                  prob food and drink s,
                                                    prob seat comfort s,
   prob online boarding s,
   prob inflight entertainment s
                 , prob_onboard_service s,
                                                prob leg room service s,
                                                 prob checkin service s,
   prob baggage handling s,
   prob inflight service s
12.
                                                      prob cleanliness s,
   prob_departure_delay_in_minutes_s, prob_arrival_delay_in_minutes_s
              FLOAT(30,30) DEFAULT 0;
13.
              DECLARE total satisfied, total notsatisfied FLOAT(30,20);
15.
16.
              DECLARE
17.
                  prob notsatisfied,
                                                          prob gender ns,
                                                prob type of travel ns,
   prob customer type ns,
                               prob age ns,
   prob customer class ns
18.
                                                prob flight distance ns,
   prob inflight wifi service ns,
   prob departure arrival time convenient ns,
   prob_ease_of_online_booking_ns
19.
                       prob_gate_location ns,
                 ,
                                                 prob food and drink ns,
   prob online boarding ns,
                                                   prob seat comfort ns,
   prob inflight entertainment ns
                 , prob onboard service ns, prob leg room service ns,
   prob baggage handling ns,
                                                prob checkin service ns,
   prob_inflight_service_ns
21.
                                                     prob cleanliness ns,
   prob_departure_delay_in_minutes_ns, prob_arrival_delay_in_minutes_ns
23.
              FLOAT (30,30) DEFAULT 0;
24.
25.
              DECLARE prediksi s, prediksi ns FLOAT(30,30);
```

```
26.
             DECLARE i, testing_ke, total_training, total_testing,
   i testing, total data INT DEFAULT 0;
27.
             DECLARE info satisfaction VARCHAR(2);
28.
29.
             SELECT COUNT(*) INTO total data FROM tbldataprocess;
30.
31.
             SET testing ke = number of testing;
32.
                  IF testing ke = 1 THEN SET total training = 0.9 *
33.
   total data;
34.
                  ELSEIF testing ke = 2 THEN SET total training = 0.75 *
   total data;
35.
                  ELSEIF testing ke = 3 THEN SET total training = 0.5 *
   total data;
36.
                  ELSEIF testing ke = 4 THEN SET total training = 0.25 *
   total data;
37.
                  ELSEIF testing ke = 5 THEN SET total training = 0.1 *
   total data;
38.
                  END IF;
39.
                  -- SET total training = 0.9 * total data;
40.
                  SET total testing = total data-total training;
41.
                  SET i testing = 1;
42.
                  UPDATE tblaccuracy SET total data=0, tp=0, tn=0, fp=0,
   fn=0,tnull=0,fnull=0 WHERE algoritma = 'Bayesian' AND testing =
   testing ke;
43.
                  UPDATE
                                         tblaccuracy
                                                                     SET
   total data training=total training, total data = total testing WHERE
   testing = testing ke AND algoritma = "Bayesian";
44.
                  TRUNCATE tbldatatesting;
45.
46.
                  TRUNCATE tbldatatraining;
47.
48.
                  INSERT INTO tbldatatraining ( Gender, customer type,
                                  customer class,
                                                       flight distance,
             type of travel,
   inflight wifi service,
                                      departure arrival time convenient,
   ease of online booking,
                                                         food and drink,
                                  gate location,
   online boarding,
                           seat comfort,
                                                 inflight entertainment,
   onboard_service, leg_room_service, baggage_handling, checkin_service,
   inflight service,
                          cleanliness,
                                             departure delay in minutes,
   arrival delay in minutes, satisfaction)
49.
                  SELECT Gender, customer type, age, type of travel,
                          flight distance,
                                                  inflight wifi service,
   customer class,
   departure_arrival_time_convenient,
                                                 ease of online booking,
                   food_and_drink,
   gate location,
                                       online boarding, seat comfort,
   inflight entertainment,
                                                       leg_room service,
                                onboard_service,
   baggage_handling, checkin_service, inflight_service, cleanliness,
   departure delay in minutes, arrival delay in minutes, satisfaction
50.
                  FROM tbldataprocess where id<= total training;
51.
52.
                  INSERT INTO tbldatatesting ( Gender, customer type,
             type of travel,
                                  customer class,
                                                       flight distance,
   inflight wifi service,
                                      departure arrival time convenient,
   ease of online booking,
                                  gate location,
                                                         food and drink,
   online boarding,
                           seat comfort,
                                                 inflight entertainment,
   onboard service, leg room service, baggage handling, checkin service,
```

```
departure_delay_in_minutes,
  arrival delay in minutes, satisfaction)
                SELECT Gender, customer type, age, type of travel,
  customer class,
                        flight_distance, inflight_wifi_service,
  departure_arrival_time convenient,
                                             ease of online booking,
  gate location, food and drink, online boarding, seat comfort,
                          onboard service, leg_room_service,
  inflight entertainment,
  baggage handling, checkin service, inflight service, cleanliness,
  departure delay in minutes, arrival delay in minutes, satisfaction
54.
                 FROM tbldataprocess WHERE
55.
                    id > total_training
56
                    AND id <= ( total training + total testing);
57.
                 SET total satisfied = (SELECT count(satisfaction) FROM
  tbldatatraining WHERE satisfaction = 1);
                 SET total notsatisfied = (SELECT count(satisfaction)
  FROM tbldatatraining WHERE satisfaction = 0);
60.
                 SET prob satisfied = total satisfied / total training;
61.
62.
                 SET prob notsatisfied = total notsatisfied /
  total training;
63.
64.
                 -- WHILE per baris
65.
                 WHILE i testing <= total testing DO
66.
                 -- GENDER
                 SET prob gender s = (SELECT count(gender) FROM
  tbldatatraining WHERE gender=(SELECT gender FROM tbldatatesting where
  id=i testing) AND satisfaction =1) / total satisfied;
                 SET prob gender ns = (SELECT count(gender) FROM
  tbldatatraining WHERE gender=(SELECT gender FROM tbldatatesting where
  id=i_testing) AND satisfaction =0) / total_notsatisfied;
69.
70.
                 -- Customer Type
71.
                         prob customer type s
  count(customer_type) FROM tbldatatraining WHERE customer type=(SELECT
  customer type FROM tbldatatesting where id=i testing) AND satisfaction
  =1) / total satisfied;
                          prob customer type ns
                 SET
  count(customer type) FROM tbldatatraining WHERE customer type=(SELECT
  customer type FROM tbldatatesting where id=i testing) AND satisfaction
  =0) / total notsatisfied;
73.
74.
                 -- AGE
                                   =
75.
                 SET prob age s
                                          (SELECT count (age)
                                                                 FROM
  tbldatatraining WHERE age=(SELECT age FROM tbldatatesting where
  id=i_testing) AND satisfaction =1) / total_satisfied;
76.
                 SET
                       prob age ns
                                    = (SELECT
                                                                 FROM
  tbldatatraining WHERE age=(SELECT age FROM tbldatatesting where
  id=i_testing) AND satisfaction =0) / total_notsatisfied;
77.
78.
                 -- Type Of Travel
79.
                 SET
                         prob type of travel s
                                                              (SELECT
                             FROM
  count(type of travel)
                                    tbldatatraining
                                                                WHERE
  type of travel=(SELECT type of travel FROM tbldatatesting where
  id=i testing) AND satisfaction =1) / total satisfied;
```

```
80.
                 SET
                           prob_type_of_travel_ns
                                                                (SELECT
  count(type_of_travel)
                               FROM
                                           tbldatatraining
                                                                  WHERE
                           type of travel FROM tbldatatesting
  type of travel=(SELECT
                                                                  where
   id=i testing) AND satisfaction =0) / total notsatisfied;
81.
82.
                 -- Customer Class
83.
                         prob customer class s
                                                                 (SELECT
  count(customer class)
                               FROM tbldatatraining
                                                                  WHERE
  customer_class=(SELECT customer class FROM tbldatatesting
                                                                  where
  id=i_testing) AND satisfaction =1) / total_satisfied;
                 SET
                           prob_customer_class_ns
                                                                 (SELECT
  count(customer class)
                               FROM
                                          tbldatatraining
                                                                  WHERE
  customer class=(SELECT
                           customer class FROM
                                                 tbldatatesting
  id=i testing) AND satisfaction =0) / total notsatisfied;
85.
86.
                 -- FLIGHT DISTANCE
87.
                 SET
                         prob flight distance s
                                                                 (SELECT
                                FROM
                                      tbldatatraining
  count(flight distance)
                                                                  WHERE
  flight distance=(SELECT flight distance FROM tbldatatesting
  id=i testing) AND satisfaction =1) / total satisfied;
                 SET
                           prob flight distance ns
                                                                (SELECT
  count(flight distance)
                                FROM
                                           tbldatatraining
                                                                  WHERE
  flight distance=(SELECT flight distance FROM tbldatatesting where
  id=i testing) AND satisfaction =0) / total notsatisfied;
89.
90.
                 -- Inflight Wifi Service
91.
                        prob inflight wifi service s
                                                                 (SELECT
                                            tbldatatraining
  count(inflight wifi service)
                                    FROM
                                                                  WHERE
  inflight wifi service=(SELECT
                                       inflight wifi service
                                                                   FROM
                  where id=i testing)
   tbldatatesting
                                           AND satisfaction
  total satisfied;
92.
                                                                (SELECT
                         prob inflight wifi service ns
                 SET
                                    FROM
                                                                  WHERE
  count(inflight wifi service)
                                             tbldatatraining
  inflight wifi service=(SELECT
                                       inflight wifi service
                                                                   FROM
  tbldatatesting
                           id=i testing)
                                         AND satisfaction
                                                                =0) /
                   where
   total notsatisfied;
93.
94.
                 -- Departure Arrival Time Convenient
95.
                 SET prob departure arrival time convenient s = (SELECT
  count (departure arrival time convenient) FROM tbldatatraining WHERE
  departure arrival time convenient=(SELECT
  departure arrival time convenient
                                       FROM
                                                tbldatatesting
                                                                  where
  id=i testing) AND satisfaction =1) / total satisfied;
                         prob departure arrival time convenient ns
   (SELECT count(departure_arrival_time_convenient) FROM tbldatatraining
                              departure arrival time convenient=(SELECT
  departure arrival time convenient
                                       FROM
                                                tbldatatesting
  id=i_testing) AND satisfaction =0) / total_notsatisfied;
97.
98.
                 -- Ease of Online Booking
99.
                 SET
                       prob ease of online booking s
                                                                 (SELECT
                                           tbldatatraining
  count(ease of online booking)
                                    FROM
                                                                  WHERE
  ease of online booking=(SELECT
                                      ease of online booking
                                                                   FROM
  tbldatatesting
                   where id=i testing) AND satisfaction
  total satisfied;
```

```
100.
                         prob_ease_of_online_booking_ns
                 SET
                                                                (SELECT
  count(ease of online booking)
                                   FROM
                                             tbldatatraining
                                                                  WHERE
   ease of online booking=(SELECT
                                      ease of online booking
                                                                   FROM
   tbldatatesting where
                           id=i testing)
                                           AND
                                                satisfaction
                                                                =0)
   total notsatisfied;
101.
102.
                 -- Gate Location
103.
                 SET
                        prob gate location s
                                                                 (SELECT
  count(gate location) FROM tbldatatraining WHERE gate_location=(SELECT
  gate location FROM tbldatatesting where id=i testing) AND satisfaction
  =1) / total_satisfied;
104.
                 SET
                           prob gate location ns
                                                                 (SELECT
   count(gate location) FROM tbldatatraining WHERE gate location=(SELECT
  gate location FROM tbldatatesting where id=i testing) AND satisfaction
  =0) / total notsatisfied;
105.
106.
                 -- Food and Drink
107.
                          prob_food and drink s
                 SET
                                                                 (SELECT
  count(food and drink)
                              FROM tbldatatraining
                                                                  WHERE
  food and drink=(SELECT food and drink FROM tbldatatesting
  id=i_testing) AND satisfaction =1) / total satisfied;
                           prob food and drink ns
108.
                 SET
                                                                 (SELECT
  count(food and drink)
                               FROM
                                          tbldatatraining
                                                                  WHERE
   food and drink (SELECT food and drink FROM tbldatatesting
                                                                  where
   id=i testing) AND satisfaction =0) / total notsatisfied;
109.
                 -- Online Boarding
110.
111.
                 SET
                           prob online boarding s
                                                                 (SELECT
                                FROM
                                           tbldatatraining
                                                                  WHERE
  count(online boarding)
   online boarding=(SELECT online boarding FROM tbldatatesting where
  id=i testing) AND satisfaction =1) / total satisfied;
112.
                 SET
                           prob_online_boarding_ns
                                                                 (SELECT
                                FROM
  count(online boarding)
                                            tbldatatraining
                                                                  WHERE
   online boarding=(SELECT online boarding FROM tbldatatesting where
   id=i testing) AND satisfaction =0) / total notsatisfied;
113.
114.
                 -- Seat Comfort
                 SET prob_seat_comfort_s = (SELECT count(seat comfort)
115.
  FROM tbldatatraining WHERE seat_comfort=(SELECT seat_comfort FROM
  tbldatatesting
                   where id=i testing)
                                           AND
                                                 satisfaction
  total satisfied;
                 SET prob seat comfort ns = (SELECT count(seat comfort)
  FROM tbldatatraining WHERE seat comfort=(SELECT seat comfort FROM
   tbldatatesting
                   where id=i testing)
                                           AND
                                                 satisfaction =0) /
  total notsatisfied;
117.
118.
                 -- Inflight Enterteinment
                 SET
                        prob inflight entertainment s
                                                                 (SELECT
  count(inflight_entertainment)
                                    FROM
                                                                  WHERE
                                             tbldatatraining
   inflight entertainment=(SELECT
                                       inflight entertainment
                                                                   FROM
   tbldatatesting
                   where id=i testing) AND satisfaction
   total satisfied;
120.
                 SET
                         prob inflight entertainment ns
                                                                 (SELECT
  count(inflight entertainment)
                                     FROM
                                              tbldatatraining
                                                                  WHERE
   inflight entertainment=(SELECT
                                      inflight entertainment
                                                                   FROM
```

```
id=i testing)
                                        AND satisfaction =0) /
  tbldatatesting where
  total notsatisfied;
121.
122.
                 -- Onboard Service
123.
                 SET
                         prob onboard service s
                                                               (SELECT
                           FROM tbldatatraining
  count(onboard service)
                                                                 WHERE
  onboard service=(SELECT onboard service FROM tbldatatesting where
  id=i testing) AND satisfaction =1) / total satisfied;
                          prob onboard service ns
124.
                 SET
                                                               (SELECT
  count(onboard service)
                               FROM tbldatatraining
                                                                 WHERE
  onboard_service=(SELECT onboard_service FROM tbldatatesting where
   id=i testing) AND satisfaction =0) / total notsatisfied;
125.
126.
                 -- Leg Room Service
127.
                 SET
                         prob leg room service s
                                                               (SELECT
                               FROM tbldatatraining
  count(leg room service)
                                                                 WHERE
   leg_room_service=(SELECT leg_room_service FROM tbldatatesting where
  id=i testing) AND satisfaction =1) / total satisfied;
128.
                 SET
                          prob leg room service ns
                                                               (SELECT
  count(leg room service)
                               FROM
                                          tbldatatraining
                                                                 WHERE
  leg room service=(SELECT leg room service FROM tbldatatesting where
  id=i testing) AND satisfaction =0) / total notsatisfied;
129.
130.
                 -- Baggage Handling
                       prob baggage handling s
131.
                                                               (SELECT
                                FROM
  count(baggage handling)
                                      tbldatatraining
                                                                 WHERE
  baggage handling=(SELECT baggage handling FROM tbldatatesting where
  id=i testing) AND satisfaction =1) / total satisfied;
                 SET
                          prob baggage handling ns
                                                               (SELECT
  count(baggage handling)
                                FROM
                                        tbldatatraining
                                                                 WHERE
  baggage handling=(SELECT baggage handling FROM tbldatatesting where
   id=i testing) AND satisfaction =0) / total notsatisfied;
133.
134.
                 -- Checkin Service
135.
                 SET
                         prob checkin service s
                                                               (SELECT
                         FROM tbldatatraining
  count(checkin service)
                                                                 WHERE
   checkin service=(SELECT checkin_service FROM tbldatatesting where
  id=i testing) AND satisfaction =1) / total satisfied;
                                                               (SELECT
136.
                 SET
                          prob checkin service ns
  count(checkin service)
                               FROM
                                         tbldatatraining
                                                                 WHERE
  checkin service=(SELECT checkin service FROM tbldatatesting where
  id=i testing) AND satisfaction =0) / total notsatisfied;
137.
138.
                 -- Inflight Service
139.
                 SET
                         prob_inflight_service_s
                                                               (SELECT
  count(inflight service)
                                FROM tbldatatraining
   inflight service=(SELECT inflight service FROM tbldatatesting where
   id=i_testing) AND satisfaction =1) / total_satisfied;
                         prob_inflight_service_ns
                                                               (SELECT
140.
                 SET
   count(inflight service)
                               FROM
                                        tbldatatraining
                                                                 WHERE
   inflight service=(SELECT inflight_service FROM tbldatatesting where
   id=i testing) AND satisfaction =0) / total notsatisfied;
141.
142.
                 -- Cleanliness
143.
                 SET prob cleanliness s = (SELECT count(cleanliness)
  FROM tbldatatraining WHERE cleanliness=(SELECT cleanliness FROM
```

```
id=i_testing)
   tbldatatesting
                   where
                                           AND
                                                 satisfaction
   total satisfied;
                 SET prob cleanliness ns = (SELECT count(cleanliness)
  FROM tbldatatraining WHERE cleanliness=(SELECT cleanliness FROM
  tbldatatesting
                   where
                           id=i testing)
                                           AND
                                                 satisfaction
   total notsatisfied;
145.
146.
                 -- Departure Delay In Minutes
147.
                 SET prob_departure_delay_in_minutes_s
                                                                 (SELECT
  count(departure delay in minutes)
                                      FROM tbldatatraining
                                                                  WHERE
  departure_delay_in_minutes=(SELECT departure_delay_in_minutes
                                                                   FROM
   tbldatatesting
                   where
                           id=i testing)
                                           AND satisfaction
   total satisfied;
                 SET
                       prob departure delay in minutes ns
                                                                 (SELECT
  count(departure delay in minutes)
                                       FROM
                                               tbldatatraining
                                                                  WHERE
  departure delay in minutes=(SELECT departure_delay_in_minutes
                                                                   FROM
   tbldatatesting where id=i testing) AND
                                                satisfaction
   total notsatisfied;
149.
150.
                 -- Arrival Delay In Minutes
151.
                      prob arrival delay in minutes s
                                                                 (SELECT
  count(arrival delay in minutes)
                                      FROM
                                             tbldatatraining
                                                                  WHERE
  arrival delay in minutes=(SELECT
                                       arrival delay in minutes
                                                                   FROM
                   where id=i testing)
                                                satisfaction
   tbldatatesting
                                           AND
   total satisfied;
152.
                 SET
                        prob arrival delay in minutes ns
                                                                 (SELECT
  count(arrival delay in minutes)
                                     FROM
                                             tbldatatraining
                                                                  WHERE
                                       arrival delay in minutes
   arrival_delay_in_minutes=(SELECT
                                                                   FROM
   tbldatatesting where id=i testing)
                                           AND
                                                 satisfaction
                                                                =0
   total notsatisfied;
153.
154.
                                     = prob satisfied* prob gender s*
                 SET prediksi s
  prob customer type s*
                               prob age s*
                                                 prob type of travel s*
                                                prob flight distance s*
  prob customer class s*
  prob inflight wifi service s*
  prob departure arrival time convenient s*
                                                  prob_gate location s*
  prob ease of online booking s*
  prob food_and_drink_s* prob_online boarding_s* prob_seat_comfort_s*
  prob inflight entertainment s*
                                                prob onboard service s*
  prob leg room service s*
                                               prob baggage handling s*
  prob checkin service s* prob inflight service s* prob cleanliness s*
  prob departure delay in minutes s* prob arrival delay in minutes s;
                 SET prediksi ns =prob notsatisfied* prob gender ns*
155.
  prob_customer_type_ns*
                              prob age ns*
                                                prob type of travel ns*
                                               prob_flight_distance_ns*
  prob_customer_class_ns*
  prob_inflight_wifi_service_ns*
  prob departure arrival time convenient ns*
  prob ease of online booking ns*
                                                 prob_gate_location_ns*
  prob_food_and_drink_ns*
                                               prob_online_boarding_ns*
  prob seat comfort ns*
                                        prob inflight entertainment ns*
  prob onboard service ns*
                                              prob leg room service ns*
  prob baggage handling ns*
                                               prob checkin service ns*
  prob inflight service ns*
                                                   prob cleanliness ns*
  prob departure delay in minutes ns* prob arrival delay in minutes ns;
156.
```

```
157.
                 SELECT satisfaction
                                         INTO
                                              info_satisfaction from
   tbldatatesting where id = i testing;
158.
159.
160.
                 IF info satisfaction = 0 THEN -- actual not satisfied
161.
                      IF prediksi s < prediksi ns THEN
162.
                         UPDATE tblaccuracy
                                                 SET
                                                        tn=tn+1
   algoritma="Bayesian" AND testing=testing ke;
                     ELSEIF prediksi s > prediksi_ns THEN
163.
164.
                         UPDATE tblaccuracy SET
                                                        fp=fp+1
                                                                   WHERE
  algoritma="Bayesian" AND testing=testing_ke;
                     ELSEIF prediksi_s = 0 AND prediksi_ns = 0 THEN
166.
                         UPDATE tblaccuracy SET fnull=fnull+1 WHERE
   algoritma="Bayesian" AND testing=testing ke;
167.
                     END IF;
168.
                 ELSEIF info satisfaction = 1 THEN -- actual satisfied
169.
                      IF prediksi s < prediksi ns THEN
170.
                         UPDATE tblaccuracy
                                                 SET
                                                        fn=fn+1
                                                                   WHERE
   algoritma="Bayesian" AND testing=testing ke;
171.
                     ELSEIF prediksi s > prediksi ns THEN
172.
                         UPDATE
                                 tblaccuracy
                                                        tp=tp+1
                                                                   WHERE
  algoritma="Bayesian" AND testing=testing ke;
                     ELSEIF prediksi s = 0 AND prediksi ns = 0 THEN
173.
                         UPDATE tblaccuracy SET tnull=tnull+1 WHERE
   algoritma="Bayesian" AND testing=testing ke;
175.
                     END IF;
176.
                 END IF;
177.
                 SET i testing = i testing+1;
178.
                 END WHILE;
179.
180.
                 SELECT testing ke as 'selesai uji ke';
181.
182.
         END ##
183.
         DELIMITER ;
184.
185. DROP PROCEDURE IF EXISTS processb;
186.
      DELIMITER ##
187.
         CREATE PROCEDURE processb()
188.
         BEGIN
189.
             CALL bayesian(1);
190.
             CALL bayesian(2);
191.
             CALL bayesian(3);
             CALL bayesian(4);
192
193.
             CALL bayesian(5);
194.
             UPDATE
                                       tblaccuracy
                                                                     SET
   accuracy=((tp+tn)/(tp+tn+fp+fn+tnull+fnull))*100
                                                                   where
   algoritma='Bayesian';
195.
196.
         END ##
197.
         DELIMITER ;
```

FUNCTION EUCLIDIAN DISTANCE

- 1. DROP FUNCTION IF EXISTS ed;
- 2. DELIMITER ##
- CREATE FUNCTION ed(

```
4.
           w1t FLOAT (30,20)
5.
           , w1 FLOAT(30,20)
            , w2t FLOAT(30,20)
6.
            , w2 FLOAT (30,20)
7.
8.
            , w3t FLOAT(30,20)
9.
            , w3 FLOAT (30,20)
               , w4t FLOAT(30,20)
10.
11.
              , w4 FLOAT (30,20)
12.
              , w5t FLOAT(30,20)
              , w5 FLOAT(30,20)
13.
14.
              , w6t FLOAT(30,20)
15.
              , w6 FLOAT(30,20)
              , w7t FLOAT(30,20)
16.
              , w7 FLOAT(30,20)
17.
18.
              , w8t FLOAT(30,20)
19.
              , w8 FLOAT (30,20)
20.
              , w9t FLOAT(30,20)
21.
              , w9 FLOAT (30,20)
              , w10t FLOAT(30,20)
22.
              , w10 FLOAT(30,20)
23.
              , w11t FLOAT(30,20)
24.
25.
              , w11 FLOAT(30,20)
              , w12t FLOAT(30,20)
26.
              , w12 FLOAT(30,20)
27.
              , w13t FLOAT(30,20)
28.
29.
              , w13 FLOAT(30,20)
              , w14t FLOAT(30,20)
30.
              , w14 FLOAT(30,20)
31.
32.
              , w15t FLOAT(30,20)
33.
              , w15 FLOAT (30,20)
              , w16t FLOAT(30,20)
34.
35.
              , w16 FLOAT(30,20)
              , w17t FLOAT(30,20)
36.
              , w17 FLOAT(30,20)
37.
              , w18t FLOAT(30,20)
38.
              , w18 FLOAT(30,20)
39.
              , w19t FLOAT(30,20)
40.
              , w19 FLOAT(30,20)
41.
42.
              , w20t FLOAT(30,20)
              , w20 FLOAT (30,20)
43.
              , w21t FLOAT(30,20)
44.
45.
              , w21 FLOAT(30,20)
46.
              , w22t FLOAT(30,20)
              , w22 FLOAT(30,20)
47.
48.
49.
              RETURNS FLOAT (30,20)
              BEGIN
50.
51.
              DECLARE hasil FLOAT(30,20) DEFAULT 0;
52.
              SET hasil = SQRT((
53.
                           POWER((w1t - w1), 2)
54.
                           + POWER((w2t - w2),2)
55.
                           + POWER((w3t - w3), 2)
56.
                           + POWER((w4t - w4), 2)
57.
                           + POWER((w5t - w5), 2)
58.
                           + POWER((w6t - w6),2)
59.
                           + POWER((w7t - w7),2)
```

```
+ POWER((w8t - w8),2)
60.
61.
                           + POWER((w9t - w9),2)
62.
                           + POWER((w10t - w10),2)
63.
                           + POWER((w11t - w11),2)
64
                           + POWER((w12t - w12),2)
65.
                           + POWER((w13t - w13), 2)
66.
                           + POWER((w14t - w14), 2)
67.
                           + POWER((w15t - w15),2)
                           + POWER((w16t - w16), 2)
68.
69.
                           + POWER((w17t - w17), 2)
70.
                           + POWER((w18t - w18),2)
71.
                           + POWER((w19t - w19), 2)
72.
                           + POWER((w20t - w20),2)
73.
                           + POWER((w21t - w21),2)
74.
                           + POWER((w22t - w22),2))
75.
                       )
76.
77.
               RETURN (hasil);
78.
          END; ##
79.
          DELIMITER ;
```

PROCEDURE LEARNING VECTOR QUANTIZATION

```
    DROP PROCEDURE IF EXISTS lvq;

2.
       DELIMITER ##
       CREATE PROCEDURE lvq(number of testing INT, pAlpha FLOAT(30,20),
   pEps FLOAT (30,20))
4.
5.
            -- Weight of class satisfied
6.
            DECLARE
   w1s, w2s, w3s, w4s, w5s, w6s, w7s, w8s, w9s, w10s, w11s, w12s, w13s, w14s, w15s, w16
   s,w17s,w18s,w19s,w20s,w21s,w22s,w23s FLOAT(30,20) DEFAULT 0;
7.
            -- Weight of class neutral or dissatisfied
8.
            DECLARE
   wlns, w2ns, w3ns, w4ns, w5ns, w6ns, w7ns, w8ns, w9ns, w10ns, w11ns, w12ns, w13ns,
   \verb|w14ns|, \verb|w15ns|, \verb|w16ns|, \verb|w17ns|, \verb|w18ns|, \verb|w19ns|, \verb|w20ns|, \verb|w21ns|, \verb|w22ns|, \verb|w23ns|
   FLOAT (30,20) DEFAULT 0;
9.
            -- Weight of training
10.
               DECLARE
   w1t,w2t,w3t,w4t,w5t,w6t,w7t,w8t,w9t,w10t,w11t,w12t,w13t,w14t,w15t,w16
   t,w17t,w18t,w19t,w20t,w21t,w22t,w23t FLOAT(30,20) DEFAULT 0;
               -- Get id for initial class satisfied and not
11.
12.
               DECLARE ids, idns, cj, t, epoch, maxepoch, pepoch INT DEFAULT
   0;
13.
               DECLARE tn lvq, fp lvq, fn lvq, tp lvq INT DEFAULT 0;
14.
15.
16.
               DECLARE ws, wns, wt FLOAT(30,20) DEFAULT 0;
17.
               DECLARE alpha, eps, err, temp alpha FLOAT(30,20) DEFAULT 0;
18.
               DECLARE info satisfaction VARCHAR(2);
19.
20.
               DECLARE prediction INT DEFAULT 0;
                                             total_training, total_testing,
               DECLARE i, testing_ke,
   i_testing, i_training, temp_i_training,
22.
                    total data, ptotal data training INT DEFAULT 0;
23.
```

```
24.
             SELECT COUNT(*) INTO total data FROM tbldataprocess;
25.
             SET testing ke = number of testing;
26.
             SET maxepoch=5;
27.
                 IF testing ke = 1 THEN SET total training = 0.9 *
28.
  total data;
29.
                     ELSEIF testing ke = 2 THEN SET total training =
  0.75 * total data;
                     ELSEIF testing ke = 3 THEN SET total training = 0.5
30.
   * total data;
                     ELSEIF testing ke = 4 THEN SET total training =
  0.25 * total data;
                     ELSEIF testing ke = 5 THEN SET total training = 0.1
   * total data;
33.
                     END IF;
                 TRUNCATE tbldatatesting;
34.
35.
                 TRUNCATE tbldatatraining;
36.
                 SET total testing = total data-total training;
37.
38.
                 SET i testing = 1;
39.
                 SET i training = 1;
40.
                 INSERT INTO tbldatatraining ( Gender, customer type,
                               customer class, flight distance,
            type of travel,
   inflight_wifi_service,
                                     departure arrival time convenient,
  ease of online booking,
                                 gate location,
                                                       food and drink,
                                                inflight entertainment,
  online boarding,
                          seat comfort,
  onboard service, leg room service, baggage handling, checkin service,
   inflight service,
                         cleanliness,
                                            departure delay in minutes,
  arrival_delay_in_minutes, satisfaction)
41.
                 SELECT Gender, customer type, age, type of travel,
                         flight_distance,
  customer class,
                                                 inflight wifi service,
                                                ease of online booking,
  departure_arrival_time_convenient,
                    food and drink,
                                      online boarding, seat comfort,
  gate location,
   inflight entertainment,
                               onboard service,
                                                     leg room service,
  baggage handling, checkin service, inflight service, cleanliness,
  departure delay in minutes, arrival delay in minutes, satisfaction
42.
                 FROM tbldataprocess where id<= total training;
43.
44.
                 INSERT INTO tbldatatesting ( Gender, customer type,
             type of travel,
                               customer class, flight distance,
   inflight wifi service,
                                     departure arrival time convenient,
  ease of online booking,
                                 gate location,
                                                        food and drink,
  online boarding,
                          seat comfort,
                                                inflight entertainment,
  onboard service, leg room service, baggage handling, checkin service,
   inflight service,
                          cleanliness,
                                            departure_delay_in_minutes,
  arrival_delay_in_minutes, satisfaction)
                 SELECT Gender, customer_type, age, type_of_travel,
45.
                         flight distance,
                                                inflight_wifi_service,
  customer class,
  departure_arrival_time_convenient,
                                                ease_of_online_booking,
  gate location, food and drink,
                                      online boarding, seat comfort,
   inflight entertainment,
                            onboard service,
                                                 leg room service,
  baggage handling, checkin service, inflight service, cleanliness,
  departure delay in minutes, arrival delay in minutes, satisfaction
46.
                 FROM tbldataprocess WHERE
47.
                     id > total training
48.
                     AND id <= ( total training + total testing);
```

```
49.
50.
                 INSERT
                            INTO
                                     tblaccuracy(algoritma,
                                                               testing,
   total data training, total data, total training, tp, tn, fp, fn, tnull,
   fnull, accuracy) VALUES
51.
                  ('LVQ', testing ke,0,0,0,0,0,0,0,0,0,0);
52.
53.
                 -- INITIALITATION
54.
                 IF pAlpha=0 THEN
55.
                     SET alpha = 0.9;
56.
57.
                     SET alpha = pAlpha;
58
                 END IF;
59.
60.
                 IF pEps=0 THEN
61.
                     SET eps = 0.0000001;
62.
                 ELSE
63.
                     SET eps = pEps;
64.
                 END IF;
65.
66.
                 -- get id from each class
                                          FROM tbldatatraining
                 SELECT id
                              INTO ids
                                                                  WHERE
   satisfaction = 1 ORDER BY RAND() LIMIT 1;
                 SELECT id INTO idns FROM tbldatatraining
                                                                  WHERE
   satisfaction = 0 ORDER BY RAND() LIMIT 1;
69.
70.
                 SELECT gender INTO w1s FROM tbldatatraining WHERE
   id=ids;
                 SELECT gender INTO w1ns FROM tbldatatraining WHERE
71.
   id=idns;
                 SELECT customer type INTO w2s FROM tbldatatraining
72.
   WHERE id=ids;
73.
                 SELECT customer type INTO w2ns FROM tbldatatraining
   WHERE id=idns;
74.
                 SELECT age INTO w3s FROM tbldatatraining WHERE id=ids;
75.
                 SELECT age INTO w3ns FROM tbldatatraining WHERE
   id=idns;
76.
                 SELECT type of travel INTO w4s FROM tbldatatraining
  WHERE id=ids;
                 SELECT type of travel INTO w4ns FROM tbldatatraining
77.
  WHERE id=idns;
                 SELECT customer class INTO w5s FROM tbldatatraining
   WHERE id=ids;
                 SELECT customer_class INTO w5ns FROM tbldatatraining
   WHERE id=idns;
80.
                 SELECT flight distance INTO w6s FROM tbldatatraining
   WHERE id=ids;
                 SELECT flight distance INTO w6ns FROM tbldatatraining
81.
   WHERE id=idns;
                 SELECT
                            inflight_wifi_service
                                                                    FROM
82.
                                                     INTO
                                                             w7s
   tbldatatraining WHERE id=ids;
                 SELECT
                           inflight wifi service
                                                    INTO
                                                            w7ns
                                                                    FROM
   tbldatatraining WHERE id=idns;
84
                 SELECT departure arrival time convenient INTO w8s FROM
   tbldatatraining WHERE id=ids;
                 SELECT departure arrival time convenient INTO w8ns FROM
   tbldatatraining WHERE id=idns;
```

- 86. SELECT ease_of_online_booking INTO w9s FROM tbldatatraining WHERE id=ids;
- 87. SELECT ease_of_online_booking INTO w9ns FROM tbldatatraining WHERE id=idns;
- 88. SELECT gate_location INTO w10s FROM tbldatatraining WHERE id=ids;
- 89. SELECT gate_location INTO w10ns FROM tbldatatraining WHERE id=idns;
- 90. SELECT food_and_drink INTO w11s FROM tbldatatraining WHERE id=ids;
- 91. SELECT food_and_drink INTO wllns FROM tbldatatraining WHERE id=idns;
- 92. SELECT online_boarding INTO w12s FROM tbldatatraining WHERE id=ids;
- 93. SELECT online_boarding INTO w12ns FROM tbldatatraining WHERE id=idns;
- 94. SELECT seat_comfort INTO w13s FROM tbldatatraining WHERE id=ids;
- 95. SELECT seat_comfort INTO w13ns FROM tbldatatraining WHERE id=idns;
- 96. SELECT inflight_entertainment INTO w14s FROM tbldatatraining WHERE id=ids;
- 97. SELECT inflight_entertainment INTO w14ns FROM tbldatatraining WHERE id=idns;
- 98. SELECT onboard_service INTO w15s FROM tbldatatraining WHERE id=ids;
- 99. SELECT onboard_service INTO w15ns FROM tbldatatraining
 WHERE id=idns;
- 100. SELECT leg_room_service INTO w16s FROM tbldatatraining WHERE id=ids;
- 101. SELECT leg_room_service INTO w16ns FROM tbldatatraining
 WHERE id=idns;
- 102. SELECT baggage_handling INTO w17s FROM tbldatatraining WHERE id=ids;
- 103. SELECT baggage_handling INTO w17ns FROM tbldatatraining WHERE id=idns;
- 104. SELECT checkin_service INTO w18s FROM tbldatatraining WHERE id=ids;
- 105. SELECT checkin_service INTO w18ns FROM tbldatatraining WHERE id=idns;
- 106. SELECT inflight_service INTO w19s FROM tbldatatraining
 WHERE id=ids;
- 108. SELECT cleanliness INTO w20s FROM tbldatatraining WHERE id=ids;
- 109. SELECT cleanliness INTO w20ns FROM tbldatatraining WHERE id=idns;
- 110. SELECT departure_delay_in_minutes INTO w21s FROM tbldatatraining WHERE id=ids;
- 111. SELECT departure_delay_in_minutes INTO w21ns FROM tbldatatraining WHERE id=idns;
- 112. SELECT arrival_delay_in_minutes INTO w22s FROM tbldatatraining WHERE id=ids;
- 113. SELECT arrival_delay_in_minutes INTO w22ns FROM tbldatatraining WHERE id=idns;

```
114.
115.
                  -- row used to initialitation is not use again
116.
                  DELETE FROM tbldatatraining WHERE id=ids;
117.
                  DELETE FROM tbldatatraining WHERE id=idns;
118.
119.
                  SET @num := 0;
                  UPDATE tbldatatraining SET id = @num := (@num+1);
120.
121.
                  ALTER TABLE tbldatatraining AUTO INCREMENT =1;
                  -- END INITIALITATION
122.
123.
124.
                  -- TRAINING
125.
                  SET temp alpha = alpha;
126.
                  WHILE epoch < maxepoch DO
127.
                      SET i training = 0;
128.
                      SET temp i training = 0;
129.
                      SET alpha=temp alpha;
                      algolvq: WHILE (i training <= total training) or
   (alpha >= eps) DO
131.
                          IF (alpha >= eps) THEN
132.
                              SELECT gender INTO w1t FROM tbldatatraining
   WHERE id=i training;
                                  SELECT customer type INTO w2t FROM
133.
   tbldatatraining WHERE id=i training;
                                                    INTO
                                  SELECT
                                             age
                                                             w3t
                                                                    FROM
   tbldatatraining WHERE id=i training;
135.
                                  SELECT type of travel INTO w4t FROM
   tbldatatraining WHERE id=i training;
                                  SELECT customer class INTO w5t FROM
136.
   tbldatatraining WHERE id=i training;
                                  SELECT flight distance INTO w6t FROM
137.
   tbldatatraining WHERE id=i_training;
138.
                                  SELECT inflight wifi service INTO w7t
   FROM tbldatatraining WHERE id=i training;
                                  SELECT
   departure arrival time convenient INTO w8t FROM tbldatatraining WHERE
   id=i training;
140.
                                  SELECT ease of online booking INTO w9t
   FROM tbldatatraining WHERE id=i training;
                                  SELECT gate location INTO w10t FROM
   tbldatatraining WHERE id=i training;
                                  SELECT food and drink INTO w11t FROM
142.
   tbldatatraining WHERE id=i training;
143.
                                  SELECT online boarding INTO w12t FROM
   tbldatatraining WHERE id=i training;
                                  SELECT seat_comfort INTO w13t FROM
144.
   tbldatatraining WHERE id=i training;
                                  SELECT
                                           inflight entertainment
                                                                     INTO
   w14t FROM tbldatatraining WHERE id=i training;
146.
                                  SELECT onboard_service INTO w15t FROM
   tbldatatraining WHERE id=i training;
                                  SELECT leg room service INTO w16t FROM
   tbldatatraining WHERE id=i_training;
148.
                                  SELECT baggage handling INTO w17t FROM
   tbldatatraining WHERE id=i training;
                                  SELECT checkin service INTO w18t FROM
   tbldatatraining WHERE id=i training;
```

```
150.
                                  SELECT inflight_service INTO w19t FROM
   tbldatatraining WHERE id=i training;
                                  SELECT cleanliness INTO w20t FROM
   tbldatatraining WHERE id=i training;
152.
                                  SELECT departure_delay_in_minutes INTO
   w21t FROM tbldatatraining WHERE id=i training;
                                  SELECT arrival delay in minutes
   w22t FROM tbldatatraining WHERE id=i training;
                                  SELECT satisfaction INTO w23t FROM
154.
   tbldatatraining WHERE id=i_training;
155.
                              SET ws = ed(w1t, w1s, w2t, w2s, w3t, w3s,
   w4t, w4s, w5t, w5s, w6t, w6s, w7t, w7s, w8t, w8s, w9t, w9s, w10t, w10s,
   w11t, w11s, w12t, w12s, w13t, w13s, w14t, w14s, w15t, w15s, w16t, w16s,
   w17t, w17s, w18t, w18s, w19t, w19s, w20t, w20s, w21t, w21s, w22t,
   w22s);
156.
                              SET wns = ed(w1t, w1ns, w2t, w2ns, w3t,
   w3ns, w4t, w4ns, w5t, w5ns, w6t, w6ns, w7t, w7ns, w8t, w8ns, w9t, w9ns,
   w10t, w10ns, w11t, w11ns, w12t, w12ns, w13t, w13ns, w14t, w14ns, w15t,
   w15ns, w16t, w16ns, w17t, w17ns, w18t, w18ns, w19t, w19ns, w20t, w20ns,
   w21t, w21ns, w22t, w22ns);
157.
158.
                              IF ws < wns THEN SET cj = 1;
159.
                                  ELSEIF ws > wns THEN SET cj = 0;
160.
                                  ELSE SET cj = 1;
161.
                                  END IF;
                              SELECT
                                        satisfaction
                                                       TNTO
                                                               t
                                                                    FROM
   tbldatatraining WHERE id=i training;
163.
                              -- cj 1 satisfied, 0 dissatisfied
164.
                              IF cj = 1 AND t = 1 THEN
165.
                                  SET w1s = w1s + (alpha * (w1t - w1s));
                                  SET w2s = w2s + (alpha * (w2t - w2s));
166.
                                  SET w3s = w3s + (alpha * (w3t - w3s));
167.
                                  SET w4s = w4s + (alpha * (w4t - w4s));
168.
                                  SET w5s = w5s + (alpha * (w5t - w5s));
169.
                                  SET w6s = w6s + (alpha * (w6t - w6s));
170.
                                  SET w7s = w7s + (alpha * (w7t - w7s));
171.
                                  SET w8s = w8s + (alpha * (w8t - w8s));
172.
                                  SET w9s = w9s + (alpha * (w9t - w9s));
173.
                                  SET w10s = w10s + (alpha * (w10t -
174.
   w10s));
                                  SET w11s = w11s + (alpha * (w11t -
175.
   w11s));
                                  SET w12s = w12s + (alpha * (w12t -
176.
   w12s));
177.
                                  SET w13s = w13s + (alpha * (w13t -
   w13s));
178.
                                  SET w14s = w14s + (alpha * (w14t -
   w14s));
179.
                                  SET w15s = w15s + (alpha * (w15t -
   w15s));
180.
                                  SET w16s = w16s + (alpha * (w16t -
   w16s));
181.
                                  SET w17s = w17s + (alpha * (w17t -
   w17s));
182.
                                  SET w18s = w18s + (alpha * (w18t -
   w18s));
```

```
SET w19s = w19s + (alpha * (w19t -
183.
   w19s));
                                 SET w20s = w20s + (alpha * (w20t -
184.
   w20s));
                                 SET w21s = w21s + (alpha * (w21t -
185.
  w21s));
186.
                                 SET w22s = w22s + (alpha * (w22t -
  w22s));
187.
188.
                             ELSEIF cj = 0 AND t = 0 THEN
189.
                                 SET wlns = wlns + (alpha * (wlt -
  w1ns));
190.
                                 SET w2ns = w2ns + (alpha * (w2t -
  w2ns));
191.
                                 SET w3ns = w3ns + (alpha * (w3t -
   w3ns));
192.
                                 SET w4ns = w4ns + (alpha * (w4t -
   w4ns));
193.
                                 SET w5ns = w5ns + (alpha * (w5t -
  w5ns));
194.
                                 SET w6ns = w6ns + (alpha * (w6t -
   w6ns));
195.
                                 SET w7ns = w7ns + (alpha * (w7t -
   w7ns));
196.
                                 SET w8ns = w8ns + (alpha * (w8t -
   w8ns));
                                 SET w9ns = w9ns + (alpha * (w9t -
197.
   w9ns));
198.
                                 SET w10ns = w10ns + (alpha * (w10t -
   w10ns));
199.
                                 SET wllns = wllns + (alpha * (wllt -
   w11ns));
200.
                                 SET w12ns = w12ns + (alpha * (w12t -
  w12ns));
201.
                                 SET w13ns = w13ns + (alpha * (w13t -
   w13ns));
                                 SET w14ns = w14ns + (alpha * (w14t -
202.
  w14ns));
203.
                                 SET w15ns = w15ns + (alpha * (w15t -
  w15ns));
204.
                                 SET w16ns = w16ns + (alpha * (w16t -
   w16ns));
                                 SET w17ns = w17ns + (alpha * (w17t -
205.
   w17ns));
206.
                                 SET w18ns = w18ns + (alpha * (w18t -
   w18ns));
207.
                                 SET w19ns = w19ns + (alpha * (w19t -
  w19ns));
                                 SET w20ns = w20ns + (alpha * (w20t -
208.
   w20ns));
209.
                                 SET w21ns = w21ns + (alpha * (w21t -
   w21ns));
210.
                                 SET w22ns = w22ns + (alpha * (w22t -
  w22ns));
211.
212.
                             ELSEIF cj = 0 AND t = 1 THEN
```

```
213.
                                 SET wlns = wlns - (alpha * (wlt -
  w1ns));
214.
                                 SET w2ns = w2ns - (alpha * (w2t -
  w2ns));
215.
                                 SET w3ns = w3ns - (alpha * (w3t -
  w3ns));
216.
                                 SET w4ns = w4ns - (alpha * (w4t -
  w4ns));
217.
                                 SET w5ns = w5ns - (alpha * (w5t -
  w5ns));
218.
                                 SET w6ns = w6ns - (alpha * (w6t -
  w6ns));
219.
                                 SET w7ns = w7ns - (alpha * (w7t -
  w7ns));
220.
                                 SET w8ns = w8ns - (alpha * (w8t -
  w8ns));
221.
                                 SET w9ns = w9ns - (alpha * (w9t -
  w9ns));
222.
                                 SET w10ns = w10ns - (alpha * (w10t -
  w10ns));
223.
                                 SET wllns = wllns - (alpha * (wllt -
  w11ns));
224.
                                 SET w12ns = w12ns - (alpha * (w12t -
  w12ns));
225.
                                 SET w13ns = w13ns - (alpha * (w13t -
  w13ns));
                                 SET w14ns = w14ns - (alpha * (w14t -
226.
  w14ns));
227.
                                 SET w15ns = w15ns - (alpha * (w15t -
  w15ns));
228.
                                 SET w16ns = w16ns - (alpha * (w16t -
  w16ns));
229.
                                 SET w17ns = w17ns - (alpha * (w17t -
  w17ns));
230.
                                 SET w18ns = w18ns - (alpha * (w18t -
  w18ns));
                                 SET w19ns = w19ns - (alpha * (w19t -
231.
  w19ns));
                                 SET w20ns = w20ns - (alpha * (w20t -
232.
  w20ns));
233.
                                 SET w21ns = w21ns - (alpha * (w21t -
  w21ns));
234.
                                 SET w22ns = w22ns - (alpha * (w22t -
  w22ns));
235.
236.
                             ELSEIF cj = 1 AND t = 0 THEN
237.
                                 SET w1s = w1s - (alpha * (w1t - w1s));
238.
                                 SET w2s = w2s - (alpha * (w2t - w2s));
                                 SET w3s = w3s - (alpha * (w3t - w3s));
239.
                                 SET w4s = w4s - (alpha * (w4t - w4s));
240.
                                 SET w5s = w5s - (alpha * (w5t - w5s));
241.
                                 SET w6s = w6s - (alpha * (w6t - w6s));
242.
243.
                                 SET w7s = w7s - (alpha * (w7t - w7s));
                                 SET w8s = w8s - (alpha * (w8t - w8s));
244.
245.
                                 SET w9s = w9s - (alpha * (w9t - w9s));
```

```
246.
                                  SET w10s = w10s - (alpha * (w10t -
   w10s));
247.
                                  SET w11s = w11s - (alpha * (w11t -
   w11s));
                                  SET w12s = w12s - (alpha * (w12t -
248.
   w12s));
249.
                                  SET w13s = w13s - (alpha * (w13t -
   w13s));
250.
                                  SET w14s = w14s - (alpha * (w14t -
   w14s));
                                  SET w15s = w15s - (alpha * (w15t -
251.
   w15s));
252.
                                  SET w16s = w16s - (alpha * (w16t -
   w16s));
253.
                                  SET w17s = w17s - (alpha * (w17t -
   w17s));
254.
                                  SET w18s = w18s - (alpha * (w18t -
   w18s));
255.
                                  SET w19s = w19s - (alpha * (w19t -
   w19s));
256.
                                  SET w20s = w20s - (alpha * (w20t -
   w20s));
257.
                                  SET w21s = w21s - (alpha * (w21t -
   w21s));
                                  SET w22s = w22s - (alpha * (w22t -
258.
  w22s));
259.
260.
                              END IF;
261.
262.
                              SET alpha = alpha - (alpha * eps);
                              UPDATE tblaccuracy SET total_data_training
   = i training+1 WHERE id=(SELECT COUNT(*) FROM tblaccuracy);
264.
265.
                              SET i training = i training + 1;
266.
                              SET temp i training = i training;
                              IF (i_training = total training) THEN
267.
268.
                                  SET temp alpha = alpha;
269.
                                  SELECT alpha as 'alphat', i training as
  't';
270.
                                  SET alpha = eps;
271.
                              ELSEIF (alpha <= eps) THEN
272.
                                  SET temp alpha = alpha;
                                  SELECT alpha as 'alphaa', i training as
273.
  't';
274.
                                  SET i_training = total_training +1;
275.
                              END IF;
276.
                          ELSE
277.
                              LEAVE algolvq;
278.
                          END IF;
279.
                      END WHILE;
280.
                      SET epoch = epoch + 1;
281.
                      IF (temp i training <> 0) THEN
282.
                          SET ptotal_data_training=ptotal_data_training
   + temp i training;
283.
                          SET pepoch=epoch;
284.
                          SELECT epoch as "epoch";
```

```
285.
                           END IF;
286.
                      END WHILE;
287.
                      UPDATE
                                  tblaccuracy SET total data training
   ptotal_data_training WHERE id=(SELECT COUNT(*) FROM tblaccuracy);
288.
                      UPDATE tblaccuracy SET total training = pepoch WHERE
   id=(SELECT COUNT(*) FROM tblaccuracy);
289.
                      INSERT
                                    INTO
                                                tblW
                                                            (testing, alpha,
   \mathtt{w1}, \mathtt{w2}, \mathtt{w3}, \mathtt{w4}, \mathtt{w5}, \mathtt{w6}, \mathtt{w7}, \mathtt{w8}, \mathtt{w9}, \mathtt{w10}, \mathtt{w11}, \mathtt{w12}, \mathtt{w13}, \mathtt{w14}, \mathtt{w15}, \mathtt{w16}, \mathtt{w17}, \mathtt{w18}, \mathtt{w19}, \mathtt{w2}
   0,w21,w22,w23) values
290.
291.
                           testing ke
292.
                           ,pAlpha
293.
                           , pEps
294.
                           , wls
295.
                            , w2s
296.
                            , w3s
297.
                            , w4s
298.
                           , w5s
299.
                           , w6s
300.
                           , w7s
301.
                           , w8s
302.
                           , w9s
                           , w10s
303.
                           , w11s
304.
305.
                           , w12s
306.
                           , w13s
                           , w14s
307.
                           , w15s
308.
309.
                           , w16s
310.
                           , w17s
                           , w18s
311.
312.
                           , w19s
                            , w20s
313.
                            , w21s
314.
                           , w22s
315.
                            , w23s
316.
317.
                      );
318.
319.
                      INSERT
                                    INTO
                                                tblW
                                                            (testing, alpha,
   w1,w2,w3,w4,w5,w6,w7,w8,w9,w10,w11,w12,w13,w14,w15,w16,w17,w18,w19,w2
   0,w21,w22,w23) values
320.
321.
                           testing ke
322.
                           ,pAlpha
323.
                           , pEps
324.
                            , wlns
325.
                           , w2ns
                           , w3ns
326.
                           , w4ns
327.
328.
                           , w5ns
                           , w6ns
329.
                           , w7ns
330.
331.
                           , w8ns
332.
                           , w9ns
                           , w10ns
333.
334.
                            , w11ns
```

```
, w12ns
335.
336.
                       , w13ns
337.
                       , w14ns
                       , w15ns
338.
                       , w16ns
339.
340.
                       , w17ns
341.
                       , w18ns
342.
                       , w19ns
343.
                       , w20ns
344.
                       , w21ns
                       , w22ns
345.
                       , w23ns
346.
347.
                  );
348.
                  -- END TRAINING
349.
350.
                  -- SELECT i_training;
351.
                  -- SELECT alpha;
352.
                  WHILE i testing <= total testing DO
                      SELECT gender INTO w1t FROM tbldatatesting WHERE
353.
   id=i testing;
                           SELECT
                                                       INTO
                                                               w2t
                                                                       FROM
                                     customer type
   tbldatatesting WHERE id=i testing;
                           SELECT age INTO w3t FROM tbldatatesting WHERE
355.
   id=i testing;
356.
                           SELECT
                                     type of travel
                                                                w4t
                                                                       FROM
                                                       INTO
   tbldatatesting WHERE id=i testing;
357.
                           SELECT
                                     customer class
                                                        INTO
                                                                w5t
                                                                       FROM
   tbldatatesting WHERE id=i testing;
358.
                           SELECT
                                     flight distance
                                                        INTO
                                                                w6t
                                                                       FROM
   tbldatatesting WHERE id=i testing;
359.
                                   inflight wifi service INTO w7t FROM
                           SELECT
   tbldatatesting WHERE id=i testing;
360.
                           SELECT departure arrival time convenient INTO
   w8t FROM tbldatatesting WHERE id=i testing;
                           SELECT ease_of_online_booking INTO w9t FROM
   tbldatatesting WHERE id=i_testing;
                           SELECT
                                     gate location
                                                      INTO
                                                              w10t
                                                                       FROM
   tbldatatesting WHERE id=i testing;
                           SELECT
                                     food and drink
                                                       INTO
                                                               w11t
                                                                       FROM
   tbldatatesting WHERE id=i testing;
                           SELECT
                                    online boarding
                                                       INTO
                                                               w12t
                                                                       FROM
   tbldatatesting WHERE id=i testing;
                                     seat_comfort
365.
                           SELECT
                                                      INTO
                                                              w13t
                                                                       FROM
   tbldatatesting WHERE id=i testing;
366.
                           SELECT inflight entertainment INTO w14t FROM
   tbldatatesting WHERE id=i testing;
                                                                       FROM
367.
                           SELECT
                                    onboard service
                                                        INTO
                                                               w15t
   tbldatatesting WHERE id=i testing;
                                                               w16t
368.
                           SELECT
                                                        INTO
                                                                       FROM
                                    leg_room_service
   tbldatatesting WHERE id=i testing;
                                    baggage handling
                           SELECT
                                                        INTO
                                                               w17t
                                                                       FROM
   tbldatatesting WHERE id=i testing;
370.
                           SELECT
                                    checkin service
                                                        INTO
                                                               w18t
                                                                       FROM
   tbldatatesting WHERE id=i testing;
371.
                           SELECT
                                    inflight service
                                                        INTO
                                                               w19t
                                                                       FROM
   tbldatatesting WHERE id=i testing;
```

```
372.
                            SELECT
                                      cleanliness
                                                       INTO
                                                                w20t
                                                                         FROM
   tbldatatesting WHERE id=i testing;
                            SELECT departure delay in minutes INTO w21t
   FROM tbldatatesting WHERE id=i testing;
374.
                            SELECT arrival delay in minutes INTO w22t FROM
   tbldatatesting WHERE id=i testing;
                            SELECT
                                      satisfaction
                                                        INTO
                                                                w23t
                                                                         FROM
   tbldatatesting WHERE id=i_testing;
376.
377.
                       SET ws = ed(
378.
                                w1t, w1s
379.
                                , w2t, w2s
380.
                                , w3t, w3s
381.
                                , w4t, w4s
382.
                                , w5t, w5s
383.
                                , w6t, w6s
384.
                                , w7t, w7s
385.
                                , w8t, w8s
386.
                                , w9t, w9s
387.
                                , w10t, w10s
                                , w11t, w11s
388.
                                , w12t, w12s
389.
390.
                                , w13t, w13s
                                , w14t, w14s
391.
392.
                                , w15t, w15s
393.
                                , w16t, w16s
                                , w17t, w17s
394.
                                , w18t, w18s
395.
396.
                                , w19t, w19s
                                , w20t, w20s
397.
398.
                                , w21t, w21s
399.
                                , w22t, w22s
400.
                            );
401.
                       SET wns = ed(
402.
                                w1t, w1ns
403.
404.
                                , w2t, w2ns
405.
                                , w3t, w3ns
406.
                                , w4t, w4ns
407.
                                , w5t, w5ns
                                , w6t, w6ns
408.
409.
                                , w7t, w7ns
410.
                                , w8t, w8ns
                                , w9t, w9ns
411.
412.
                                , w10t, w10ns
413.
                                , w11t, w11ns
414.
                                , w12t, w12ns
                                , w13t, w13ns
415.
                                , w14t, w14ns
416.
                                , w15t, w15ns
417.
                                , w16t, w16ns
418.
419.
                                , w17t, w17ns
420.
                                , w18t, w18ns
421.
                                , w19t, w19ns
                                , w20t, w20ns
422.
```

, w21t, w21ns

423.

```
, w22t, w22ns
424.
425.
                          );
426.
427.
428
                      SELECT satisfaction INTO info satisfaction FROM
   tbldatatesting WHERE id=i testing;
429.
                      IF ws < wns THEN SET prediction = 1;</pre>
430.
                          ELSEIF ws > wns THEN SET prediction = 0;
431.
                          ELSE SET prediction = 1;
432.
                      END IF;
433.
                      IF info satisfaction = 0 AND prediction=0 THEN
434.
                          SET tn lvq=tn lvq+1;
435.
                      ELSEIF info satisfaction = 0 AND prediction=1 THEN
436.
                           SET fp lvq=fp_lvq+1;
437.
                      ELSEIF info_satisfaction = 1 AND prediction=0 THEN
438.
                           SET fn lvq=fn_lvq+1;
439.
                      ELSEIF info satisfaction = 1 AND prediction=1 THEN
440.
                          SET tp lvq=tp lvq+1;
441.
                      END IF;
442.
                  SET i testing = i testing + 1;
                  END WHILE;
443.
444.
445.
                  UPDATE tblaccuracy SET total data=total testing
446.
                      , tn=tn lvq
447.
                      , fp=fp lvq
448.
                      , fn=fn lvq
                      , tp=tp_lvq
449.
450.
                      WHERE
451.
                      id = (SELECT count(*) FROM tblaccuracy)
452.
                  SELECT testing ke as 'selesai uji ke', pAlpha as 'a',
  pEps as 'eps';
454.
        END ##
455.
          DELIMITER ;
456.
457. DROP PROCEDURE IF EXISTS processl;
458.
         DELIMITER ##
          CREATE PROCEDURE process1(alpha FLOAT(30,20), eps FLOAT(30,20))
459.
460.
         BEGIN
461.
              CALL lvq(1,alpha,eps);
462.
              CALL lvq(2,alpha,eps);
              CALL lvq(3,alpha,eps);
463.
464.
              CALL lvq(4,alpha,eps);
465.
              CALL lvq(5,alpha,eps);
466.
              UPDATE
                            tblaccuracy
                                               SET
                                                         accuracy
   ((tp+tn)/(tp+tn+fp+fn))*100 WHERE algoritma="LVQ";
              SELECT * FROM tblaccuracy WHERE id>((SELECT COUNT(*) FROM
467.
   tblaccuracy) -5);
468.
         END ##
469.
          DELIMITER ;
470.
471. DROP PROCEDURE IF EXISTS processlvq;
472
         DELIMITER ##
473.
         CREATE PROCEDURE processlvq()
474.
          BEGIN
475.
              CALL process1(0.9,0.0000001);
```

```
476.
              CALL process1(0.9,0.0001);
477.
             CALL process1(0.9,0.01);
478.
             CALL process1(0.1,0.0000001);
479.
              CALL process1(0.1,0.0001);
480.
              CALL process1(0.1,0.01);
481.
482.
483.
             CALL process1(0.01,0.0000001);
             CALL process1(0.01,0.0001);
484.
485.
              CALL process1(0.05,0.0000001);
486.
487.
              CALL process1(0.05,0.0001);
488.
489.
              END ##
         DELIMITER ;
490.
```