

Application of Nave Bayes Algorithm for SMS Spam Classification Using Orange

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Abstract

Mobile phones have become a necessity for everyone. SMS is a communication service that is used to send and receive short messages in the form of text on mobile phones. Among all the advantages of SMS, there is a very annoying activity called spam (unsolicited commercial advertisements). Spam is the continuous use of electronic devices to send messages. called spammers. Spam messages are sent by advertisers with the lowest operating costs. Therefore, there are a lot of spammers and the number of messages requested is huge. Therefore, many aspects are harmed and disturbed. When SMS enters the user's mobile device, this study aims to classify spam and ham SMS. SMS classification adopts naive Bayes method. By looking at the contents of the SMS, the application of the naive Bayes method in data mining can distinguish unwanted SMS from non-spam. Results The classification accuracy rate is 0.999%. Based on the research that I have done, the Naive Bayes method can classify 1000 SMS spam data contained in the SMS spam data set file correctly.

Keyword: Classification; SMS; Spam; Ham; Naive Bayes

Introduction

In today's technological era, mobile phones are very common and are owned by almost all lower, middle and upper classes. Even in practice, mobile phones have become a secondary necessity for various circles of society. Sms (Short Message Service) is a mobile function, a very basic and necessary function on a mobile device. This functionality is considered as one of the common types of services because it is very cheap and easy to use for all mobile users, but among all the advantages of SMS, there is a very annoying activity called spam (unsolicited commercial advertisements). Spam is a type of message sending continuously through electronic devices, the message is considered annoying and unimportant without the permission of the recipient. People who send spam are called spammers. Spam emails are sent by advertisers with the lowest operating costs, so there are many spammers and the number of emails requested is very high, so many people feel disadvantaged and uncomfortable with this. Naive Bayes method is a classification method based on Bayes' theorem. The Naive Bayes method uses statistical and probability methods to generate categorical data to predict the future based on the past. The data set comes from <https://www.kaggle.com/shravan3273/sms-spam>.

In this study, the method to solve the problem of spam messages can use classification technology that groups between spam and ham messages when the message enters the user's mobile device. SMS classification uses the Naive Bayes method when viewing SMS content. The application of the naive bayes method in data mining is expected to be able to distinguish spam or ham messages.

Theoretical Framework

A. SMS (Short Message Service)

Short message service, or better known as SMS (Short Message Service), is a cellular telephone service that allows users to exchange written messages. SMS typically contain up to 160 characters and are used to send one-time messages, which can be sent wirelessly without the need for an Internet network.

B. Spam SMS

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There are two characteristics of spam messages: the first is unsolicited messages and the second is the large number of messages sent (sent in groups). The characteristics of SMS spam are very different from spam. The amount and content of spam is clearly different. In email, spam can be classified by subject, subject, sender, and usable characters. The capacity is greater than email. A message can only contain 160 characters.

C. Data Mining

Data mining refers to the process of discovering previously unknown information from large data sets. In this process, data mining will extract valuable information by analyzing the presence of certain patterns or relationships in big data. Another definition of data mining is a set of processes that use one or more computer learning techniques to automatically analyze and extract knowledge, or a set of processes to explore additional value from data sets in the form of artificially unknown knowledge. Since data mining is a series of processes, data mining can be divided into several stages. This stage is interactive, with user participation directly or through a knowledge base. These stages are shown in Fig 1.

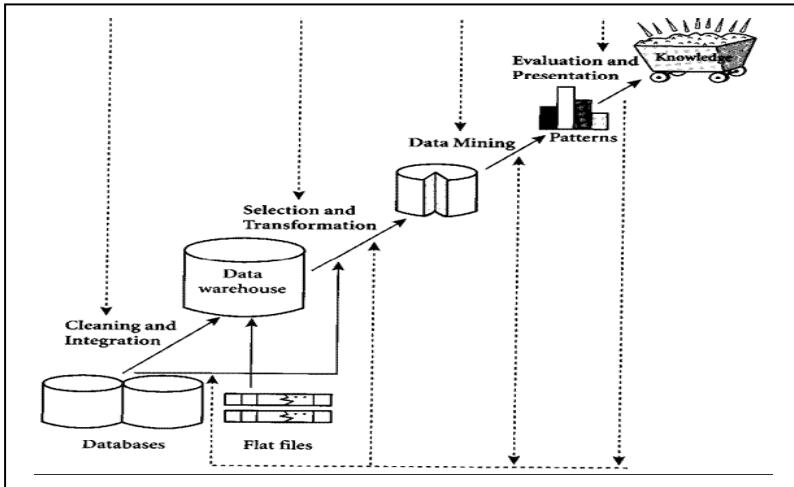


Fig 1. Data mining stages

D. Naive Bayes

Naive Bayes is a simple probability-based prediction technique, which is based on the application of Bayes' theorem (Bayes rule) and assumes strong independence. (Placettio, 2012).

$$P(H|X) = \frac{P(X|H) \cdot P(H)}{P(X)} \dots \dots \dots (1)$$

Methods

Calculation of naive bayes classification using Orange tools/applications.

1. Dataset Preparation

The data used is a dataset available on the webset page <https://www.kaggle.com/shravan3273/sms-spam>.with the filename spam.tab

2. Corpus Viewers

Corpus Viewer to view the text file that we are using. The data is obtained after connecting the corpus with the corpus viewer as below.

3. Data Sampler

At this stage select a subset of data from the input data set.

4. Text Preprocess

Text preprocessing is the stage where we select data so that the data we process becomes more structured.

5. Bag of Words

The function of the bag of words is to display text into a set of words that can be represented by their appearance in a document

6. Naive Bayes

Formulation using the nave Bayes method using the equations of Bayes' theorem:

$$P(H|X) = \frac{P(X|H) \cdot P(H)}{P(X)} \quad (2)$$

Description:

X: unfinished class known

H: Hypothesis data X is a specific class

P(H|X): Probability of hypothesis H based on Condition X

P(H): Probability hypothesis H

P(X|H): Probability X based on condition On the hypothesis H

P(X): Probability X process

classification requires
some hints for
determine what label/class is
match the sample
Then the above formula is adjusted to be:

$$P(C|F_1 \dots F_n) = \frac{P(C)P(F_1 \dots F_n|C)}{P(F_1 \dots F_n)} \quad (3)$$

7. *Prediction*

Forecasting is the result of estimating invisible data. AUC (Area Under the Curve)

a. The use of Prediction contained in the AUC model makes it easy to compare one model to another

b. CA (Classification Accuracy)

Calculate the classification accuracy level

c. F1

The average balance of precision and memory, the formula is:

$F1 = 2x (\text{precision} \times \text{recall}) / (\text{precision} + \text{recall})$ (4)

d. *Precision*

The classifier does not provide the ability to assign a positive label to a negative sample and vice versa. Precision has the following formula:

$Precision = tp / (tp + fp)$ (5)

Description:

Tp = number of true positives

Fp = number of false positives

e. *Recall*

Classifier has the ability to find and classify all samples with positive values.

8. *Confusion Matrix*

Performance measurement for data mining classification problems with two or more output classes.

9. ROC Analysis

Analyzing the results of the tool's performance measurement to classify the problem of determining model thresholds.

Results and Discussion

Orange is a data mining application that automatically calculates based on the widget that the researcher chooses.

1. Dataset Preparation

The data set used is called Spam.tab. This dataset has been prepared by orange application as training data..

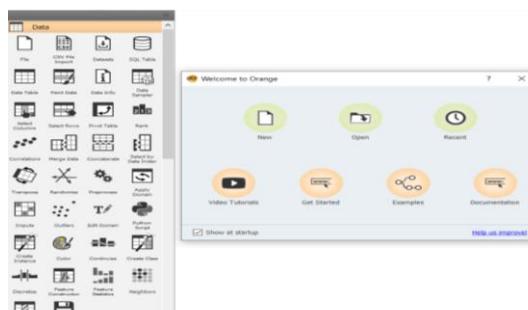


Fig 2. New menu page for starting data mining calculations

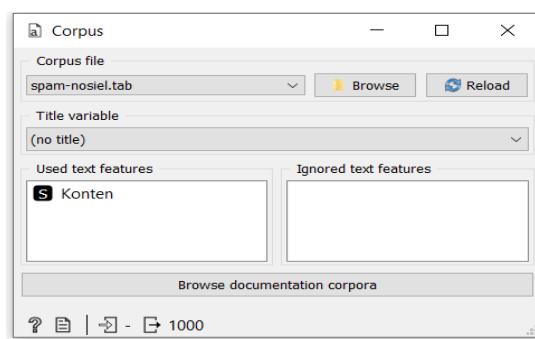


Fig 3. Selecting a dataset with the file name spam-nosiel.tab

2. *Corpus Viewer*

Corpus Viewerto see the text file we are using. The data is obtained after connecting the corpus with the corpus viewer as below.

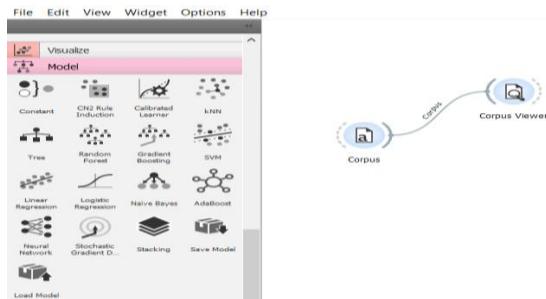


Fig 4. Corpus Viewer

Double click then the corpus viewer form displays info, search features and display features.

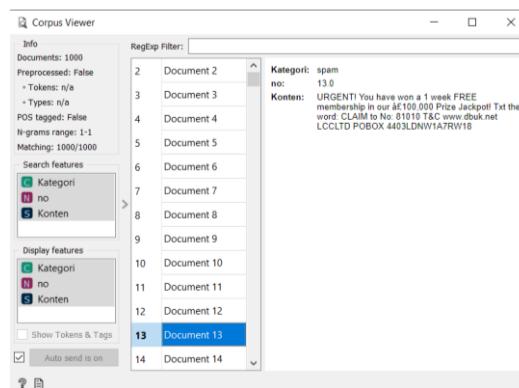


Fig 5. Displaying info, search features and display features.

3. Data Sampler

At this stage select a subset of data from the input data set.

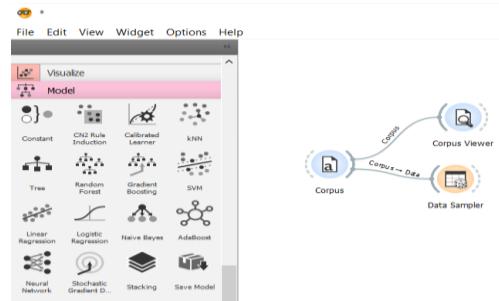


Fig 6. Data sampler

Double click then the sampler data form displays the sampling type

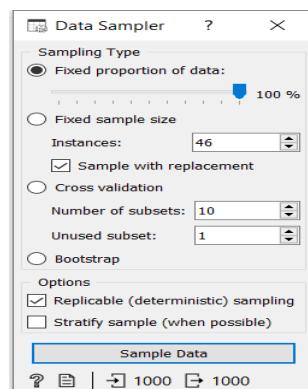


Fig 7. Showing the sampling type

4. Preprocess Text

Text Preprocessing is the stage where we select the data so that the data that we will process becomes more structured.

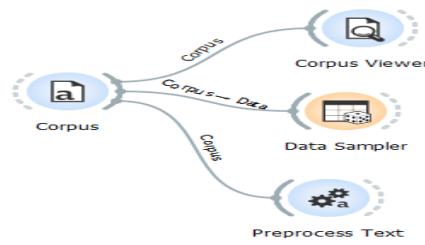


Fig 8. Preprocess Text

5. Bag of Words

The function of the bag of words is to display text into a set of words that can be represented by their appearance in a document

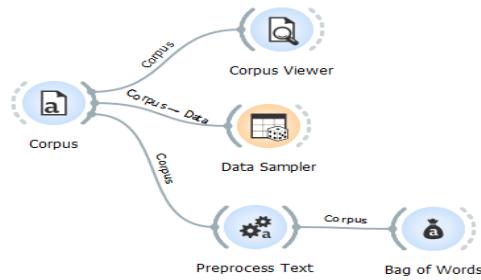


Fig 9. Bag of Words

6. Naive Bayes

Enter and produce models and learners in the form of data and preprocessors.

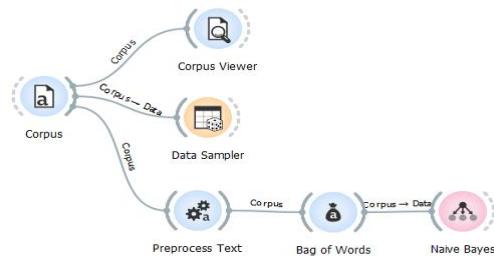


Fig 10. Nave Bayes

7. Prediction

Prediction is estimating the outcome for invisible data.

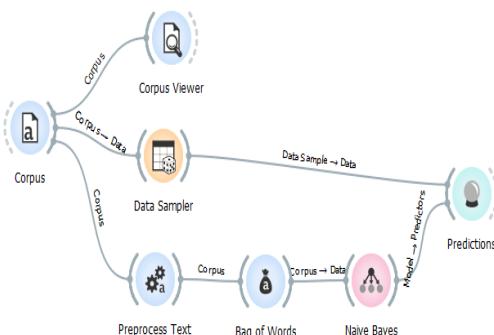


Fig 11. Prediction

Predictions		Konten	
Show probabilities for ham		Konten	
1	Native Bayes	1	6228. That's very rude, you on campus?
2	1.00 - 0.00 - ham	2	7760. Haha maybe like, U know me well. Da feeling of being liked by someone is qd for. U faster go find one then a...
3	1.00 - 0.00 - ham	3	7410. Just got up, have to be out of the room very soon. Sigh... I hadn't put the clock back till 8 I shouted at everyone ...
4	1.00 - 0.00 - ham	4	6812. Sorry me going home first. Daddy come fetch L later...
5	1.00 - 0.00 - ham	5	4120. Bring home some Wendy's XD
6	1.00 - 0.00 - ham	6	6769. What is the best place you talk off? Explain!
7	0.00 - 1.00 - spm	7	6210. New TEXTBUDDY Chat 2.0mmy guys in ur area 4 just 25p Free 2 receive Search postcode or at gettextbuddy.com ..
8	1.00 - 0.00 - ham	8	5340. Some competition for him.
9	1.00 - 0.00 - ham	9	6801. Your brother is a genius
10	1.00 - 0.00 - ham	10	1510. I'm gonna call and meet him
11	1.00 - 0.00 - ham	11	8023. I know u have it.
12	1.00 - 0.00 - ham	12	7710. Those cool... i want to performace we will treat you with dignity and respect.
13	1.00 - 0.00 - ham	13	6370. What will we do in the shower, baby?
14	1.00 - 0.00 - ham	14	9740. Hey no! I ed a crap now we been without ya 2 boggy with me boring batch! Thanx but u wait til time if ever ya...
15	1.00 - 0.00 - ham	15	9380. Ali we set it all us we'll have time if comes. Then set our come to someone this pregat. Valia Money back in life ...
16	1.00 - 0.00 - ham	16	9800. How is it possible to teach you. And where.
17	1.00 - 0.00 - ham	17	2810. You got called a tool?
18	1.00 - 0.00 - ham	18	8840. Gibbs around mille Honey
19	1.00 - 0.00 - ham	19	7620. Nothing but we just we would ask cos u ba gua... But we went nt faber yesterday. Yet just went out already math so ...
20	1.00 - 0.00 - ham	20	3200. Coffee cake... guests...
21	1.00 - 0.00 - ham	21	5500. Hurry up, I've been weed-deficient for like three days
22	1.00 - 0.00 - ham	22	1750. Well, I'm gonna finish my bath now. Have a good fine night.

Fig 12. Output Prediction

Based on the calculation results can be:

1. AUC = 0.999
2. CA = 0.983
3. F1 = 0.983
4. Precision = 0.984
5. Recall = 0.983

8. Confusion Matrix

Based on the prediction results, the confusion matrix produces selected data and data.

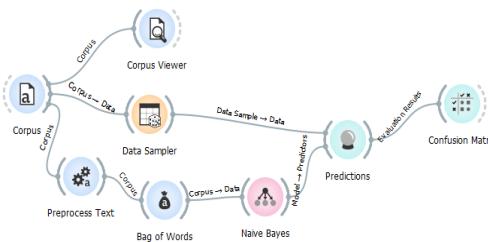


Fig 13. Confusion Matrix

Learners		Predicted			Show: Number of instances
		ham	spam	Σ	
Actual	ham	831	16	847	
	spam	1	152	153	
		Σ	832	168	1000
		Select Correct		Selected Misclassified	Clear Selection

Fig 14. Output Confusion Matrix

From the Confusion Matrix, there are data results, including:

- a. From a total of 832 ranked human rights data, there are 831 human rights data whose predictions are consistent with the actual data.
- b. From a total of 168 ranking spam data, there are 152 spam data whose predictions are consistent with the actual data.

9. ROC Analysis

ROC analysis was obtained from the evaluation results. Describe the relationship between sensitivity and specification for a naive Bayes model in the form of a line graph.

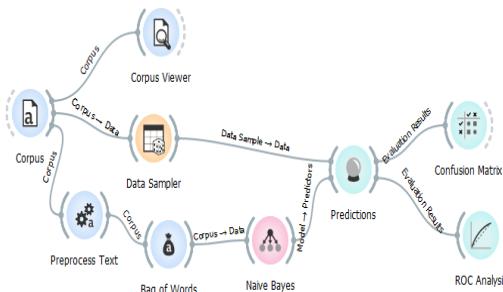


Fig 15. ROC Analysis

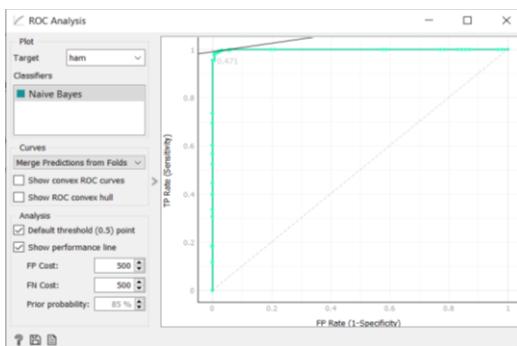


Fig 16. Ham Classification ROC Graph

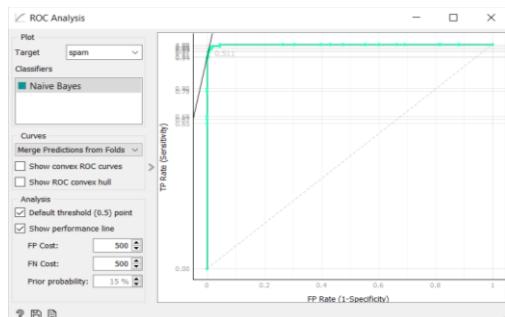


Fig 17. Spam Classification ROC Graph

After making predictions, we test the AUC of the Naive Bayes method to get accuracy from the smallest to the largest, we use the Data Sampler and change the Sampling Type, such as Fixed Proportion Of data to 100%, we get AUC = 0.998, CA = 0.971, F1 = 0.972, Precision = 0.974, Recall = 0.971, then we change the Cross Validation number of subsets to 10 and unused subsets to 1 in getting AUC = 0.999, CA = 0.982, F1 = 0.983, Precision = 0.984, Recall = 0.982, then we change Bootstrap got AUC = 0.998, CA = 0.971, F1 = 0.972, Precision = 0.974, Recall = 0.971, in table 1 the comparison changed the Sampling Type as shown in the table below.

TABLE 1. Comparison of AUC changing Sampling Type

No.	Sampling Type	AUC	CA	F1	Precision	Recall
1.	Fixed Proportion Of data menjadi 100%	0.998	0.971	0.972	0.974	0.971
2.	Cross Validation number of subsets menjadi 10 dan unused subsets menjadi 1	0.999	0.982	0.983	0.984	0.982
3.	Bootstrap	0.998	0.971	0.972	0.974	0.971

Conclusions

The results of the research that have been carried out, it can be concluded that the naive Bayes method can correctly classify 1000 unwanted text messages contained in the spam.tab dataset file. The results of the classification precision are AUC = 0.999, CA = 0.982, F1 = 0.983, Precision = 0.984, Recall = 0.982, orange applications can use ROC analysis to visualize data in data mining through the naive Bayes method using line graphs. According to my research based on cross-validation of sampling type, the highest precision is 0.999%

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