

APPLICATION OF MAMDANI FUZZY METHOD TO DETERMINE ROUND BREAD PRODUCTION AT PT VANESSA BAKERY

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ABSTRACT

Mamdani Fuzzy is a method that interprets input values and makes conclusions based on IF-THEN rules and producing the output. In this research Mamdani fuzzy method is applied to determine the amount of round bread production at PT Vanessa Bakery. The step involve: determining the fuzzy system, the membership functions, as well as the fuzzy rules. The defuzzification process is applied to determine the amount of total production and to calculate the MAPE value of the Mamdani fuzzy method. The calculated MAPE as much as 5.94%, indicates this method has an excellent forecasting ability because the value is less than 10%. Thus, the Mamdani fuzzy method can be used at PT Vanessa Bakery.

Keywords: *fuzzy logic, Mamdani method, total production*

1. PRELIMINARY

The implementation of production activities in a business entity is based on production planning. Production planning can be interpreted as an activity determining the produced product, the source of raw materials, the amount of production, and the time to complete the production process. Determination of the amount of production in production planning aims to meet market demand with the appropriate number of products.

PT Vanessa Bakery is one business entity that produces bread. This business entity is located on Astasura Street I Number 46, Peguyangan, Denpasar, Bali. The problem of PT Vanessa Bakery is the difficulty in determining the amount of bread production. Bread production uses predictions without prior calculation. In PT Vanessa Bakery's round bread products, the percentage of bread returns reaches 16% per year from the total production. Thus, it is necessary to calculate the amount of PT Vanessa Bakery round bread production, in order to reduce the return on goods.

Demand, sales returns, and stock are uncertain elements. Fuzzy logic can be used to solve problems that contain elements of uncertainty. The element of uncertainty can be in

the form of incomplete information, doubts, or inaccurate information. Each fuzzy set has a limited membership value from the membership function that represents it. That allows maximum fuzzy settings to be set in the given situation (Robandi, 2006).

The Fuzzy Inference System (FIS) method works on the basis of fuzzy reasoning principles, for example the determination of goods production, decision support systems, and data classification systems. FIS is a method that interprets input values, draws conclusions based on IF-THEN rules given, and then produces output. The Mamdani Fuzzy Method is the most common method when discussing fuzzy methodologies. The advantages of the Fuzzy Mamdani method are intuitive, widely accepted, and very suitable given human input (Naba, 2009).

The application of Mamdani Fuzzy method in determining the amount of production has been done, including by Fajar Solikin and Norma Endah Haryati. Fajar Solikin (2011), conducted research using the Mamdani method and Sugeno's method in optimizing the production of goods. The research obtained the results of the method that most closely approximated the truth value was the production obtained by processing data using the Mamdani method. Norma Endah Haryati (2014), conducted a

study using the Mamdani method based on demand prediction on planning the number of wood floor products. The conclusion obtained in this research is that the Mamdani method can be used to determine the number of products based on inventory data and demand prediction.

Thus, in determining the amount of rounded bread production at PT Vanessa Bakery the author uses the Mamdani Fuzzy method by considering the demand, sales returns, and stock. The purpose of this research was to application Mamdani fuzzy method to determine the amount of rounded bread production at PT Vanessa Bakery.

2. RESEARCH METHODS

The data used in this research is secondary data. Data obtained from PT Vanessa Bakery (Mr. Peter Kurniawan Susilo), it is demand, sales returns, stock, and total production data of round bread per week (January 2016 to May 2017). The steps taken in this research are as follows:

1. Establish the fuzzy system

Fuzzy systems are used to predict a fuzzy logic function. The formation of fuzzy systems is supported by forming fuzzy variables, fuzzy sets, the universe, and the domain.

- a. Fuzzy variables in this study consist of input variables (demand, sales returns, stock) and output variables (total production).
- b. Fuzzy sets are used in the variable of demand, sales returns, stock and total production a LOW, MEDIUM, and HIGH.
- c. The universe is obtained from the maximum and minimum value on the data of each fuzzy variable.
- d. The domain is determined by the boundaries of the discussion for each fuzzy set.

2. Establish the membership function

Membership functions for demand, sales returns, stock, and total production variable use a shoulder shape curve representation because it has three fuzzy sets.

3. Arrange a rule base that contains rules in the form of an implication function. The fuzzy rules that can be formed are obtained from the results of the number of each fuzzy set in the input variable (Bojadziew & Bojadziew, 2007). Rules that can be formed are as follows:

Table 1. The Rules of Demand, Sales Returns, Stock, and Total Production Variables

| R | D | SR | S | TP |
|----|---|----|---|----|
| 1 | L | L | L | L |
| 2 | L | L | M | L |
| 3 | L | L | H | M |
| 4 | L | M | L | L |
| 5 | L | M | M | L |
| 6 | L | M | H | M |
| 7 | L | H | L | L |
| 8 | L | H | M | L |
| 9 | L | H | H | M |
| 10 | M | L | L | L |
| 11 | M | L | M | M |
| 12 | M | L | H | H |
| 13 | M | M | L | L |
| 14 | M | M | M | M |
| 15 | M | M | H | H |
| 16 | M | H | L | L |
| 17 | M | H | M | M |
| 18 | M | H | H | H |
| 19 | H | L | L | M |
| 20 | H | L | M | H |
| 21 | H | L | H | H |
| 22 | H | M | L | M |
| 23 | H | M | M | H |
| 24 | H | M | H | H |
| 25 | H | H | L | M |
| 26 | H | H | M | H |
| 27 | H | H | H | H |

Where:

- R = Rules
- D = Demand
- SR = Sales Returns
- S = Stock
- TP = Total Production
- L = Low
- M = Medium
- H = High

The implication function used is Min function to obtain α -predicate of each rule that express on the equation (1)

$$\mu_{\tilde{A} \cap \tilde{B}} = \min(\mu_{\tilde{A}}(x), \mu_{\tilde{B}}(y)) \tag{1}$$

Where

$\mu_{\tilde{A} \cap \tilde{B}}$ = membership value results of operating operators AND fuzzy sets \tilde{A} and \tilde{B}

$\mu_{\tilde{A}}(x)$ = membership degree of fuzzy set \tilde{A}

$\mu_{\tilde{B}}(y)$ = membership degree of fuzzy set \tilde{B}

4. Look for fuzzy set solutions using the maximum method on the equation (2).

$$\mu(x_i) = \max(\mu_{sf}(x_i), \mu_{kf}(x_i)) \tag{2}$$

Where

$\mu(x_i)$ = fuzzy set solutions

$\mu_{sf}(x_i)$ = membership value of fuzzy solutions to i-th rule

$\mu_{kf}(x_i)$ = membership value of consequent fuzzy to i-th rule

5. Look for a crisp solution as output using the centroid method in the equation (3)

$$z^* = \frac{\sum_{j=1}^n z_j \mu(z_j)}{\sum_{j=1}^n \mu(z_j)} \quad (3)$$

Where

z^* = center of fuzzy region

z_j = output value at j-th rule

$\mu(z_j)$ = membership degree output value at j-th rule

6. Calculate the value of Mean Absolute Percentage Error (MAPE) by using the results of the defuzzification fuzzy mamdani method and original data

$$MAPE = \left(\frac{100\%}{n}\right) \sum_{t=1}^n \frac{|x_t - F_t|}{x_t} \quad (4)$$

with x_t is the actual data at t period, F_t is the forecasting value at t period, and n is a lot of data. Forecasting ability is very good if it has a MAPE value of less than 10% (Margi dan Pandawa, 2015).

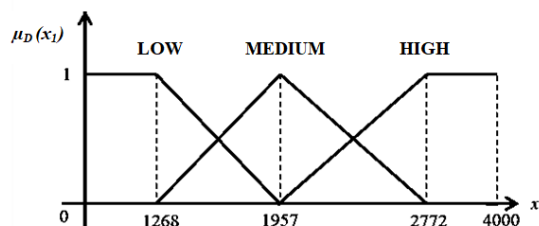
3. RESULT AND DISCUSSION

The formation of the PT Vanessa Bakery fuzzy bread rounded system consists of fuzzy variables, fuzzy sets, the universe, domains, and parameters can be seen in Table 2.

Table 2. Fuzzy System of Round Bread of PT Vanessa Bakery

| Variable | Fuzzy Set | Universe | Domain | Parameter |
|----------|-----------|-----------|--------------|--------------------|
| D | L | [0, 4000] | [0, 1957) | (0; 1268; 1957) |
| | M | | (1268, 2772) | (1268; 1957; 2772) |
| | H | | (1957, 4000] | (1957; 2772; 4000) |
| SR | L | [0, 800] | [0, 403) | (0; 253; 403) |
| | M | | (253, 662) | (253; 403; 662) |
| | H | | (403, 800] | (403; 662; 800) |
| S | L | [0, 250] | [0, 113) | (0; 54; 113) |
| | M | | (54, 198) | (54; 113; 198) |
| | H | | (113, 250] | (113; 198; 250) |
| TP | L | [0, 5000] | [0, 2500) | (0; 1250; 2500) |
| | M | | (1250, 3750) | (1250; 2500; 3750) |
| | H | | (2500, 5000] | (2500; 3750; 5000) |

Based on Table 2, the membership functions of each variable are represented as follows:



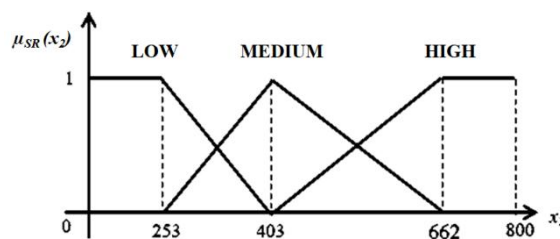
Picture 1. Curve of Membership Function of Round Bread Demand

Membership functions of demand variable:

$$\mu_{DLOW}(x_1) = \begin{cases} 1 & ; x_1 \leq 1268 \\ \frac{1957 - x_1}{689} & ; 1268 \leq x_1 \leq 1957 \\ 0 & ; x_1 \geq 1957 \end{cases}$$

$$\mu_{DMEDIUM}(x_1) = \begin{cases} 0 & ; x_1 \leq 1268 \text{ or } x_1 \geq 2772 \\ \frac{x_1 - 1268}{689} & ; 1268 \leq x_1 \leq 1957 \\ \frac{2772 - x_1}{815} & ; 1957 \leq x_1 \leq 2772 \end{cases}$$

$$\mu_{DHIGH}(x_1) = \begin{cases} 0 & ; x_1 \leq 1957 \\ \frac{x_1 - 1957}{815} & ; 1957 \leq x_1 \leq 2772 \\ 1 & ; x_1 \geq 2772 \end{cases}$$



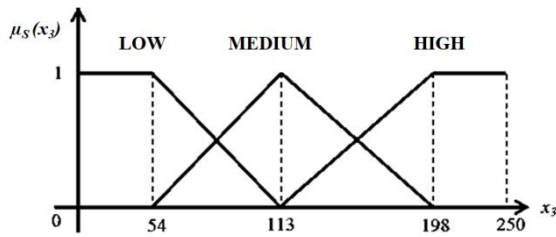
Picture 2. Curve of Membership Function of Round Bread Sales Returns

Membership functions of sales returns variable:

$$\mu_{SRLow}(x_2) = \begin{cases} 1 & ; x_2 \leq 253 \\ \frac{403 - x_2}{150} & ; 253 \leq x_2 \leq 403 \\ 0 & ; x_2 \geq 403 \end{cases}$$

$$\mu_{SRMEDIUM}(x_2) = \begin{cases} 0 & ; x_2 \leq 253 \text{ or } x_2 \geq 662 \\ \frac{x_2 - 253}{150} & ; 253 \leq x_2 \leq 403 \\ \frac{662 - x_2}{259} & ; 403 \leq x_2 \leq 662 \end{cases}$$

$$\mu_{SRHIGH}(x_2) = \begin{cases} 0 & ; x_2 \leq 403 \\ \frac{x_2 - 403}{259} & ; 403 \leq x_2 \leq 662 \\ 1 & ; x_2 \geq 662 \end{cases}$$



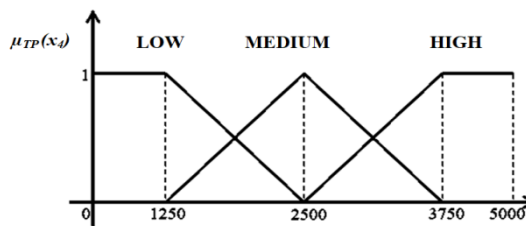
Picture 3. Curve of Membership Function of Round Bread Stock

Membership functions of stock variable:

$$\mu_{SLOW}(x_3) = \begin{cases} 1 & ; x_3 \leq 54 \\ \frac{113 - x_3}{59} & ; 54 \leq x_3 \leq 113 \\ 0 & ; x_3 \geq 113 \end{cases}$$

$$\mu_{SMEDIUM}(x_3) = \begin{cases} 0 & ; x_3 \leq 54 \text{ or } x_3 \geq 198 \\ \frac{x_3 - 54}{59} & ; 54 \leq x_3 \leq 113 \\ \frac{198 - x_3}{85} & ; 113 \leq x_3 \leq 198 \end{cases}$$

$$\mu_{SHIGH}(x_3) = \begin{cases} 0 & ; x_3 \leq 113 \\ \frac{x_3 - 113}{85} & ; 113 \leq x_3 \leq 198 \\ 1 & ; x_3 \geq 198 \end{cases}$$



Picture 4. Curve of Membership Function of Round Bread Total Production

Membership functions of total production variable:

$$\mu_{TPLOW}(x_4) = \begin{cases} 1 & ; x_4 \leq 1250 \\ \frac{2500 - x_4}{1250} & ; 1250 \leq x_4 \leq 2500 \\ 0 & ; x_4 \geq 2500 \end{cases}$$

$$\mu_{TPMEDIUM}(x_4) = \begin{cases} 0 & ; x_4 \leq 1250 \text{ or } x_4 \geq 2500 \\ \frac{x_4 - 1250}{1250} & ; 1250 \leq x_4 \leq 2500 \\ \frac{3750 - x_4}{1250} & ; 2500 \leq x_4 \leq 3750 \end{cases}$$

$$\mu_{TPHIGH}(x_4) = \begin{cases} 0 & ; x_4 \leq 2500 \\ \frac{x_4 - 2500}{1250} & ; 2500 \leq x_4 \leq 3750 \\ 1 & ; x_4 \geq 3750 \end{cases}$$

Example, 1st period data, D = 2370, SR = 253, and IT = 82.

1. Membership value fuzzy set of demand variable

$$\mu_{DLLOW}(2370) = 0$$

$$\mu_{DMEDIUM}(2370) = \frac{2772 - 2370}{815} = 0,49$$

$$\mu_{DHIGH}(2370) = \frac{2370 - 1957}{815} = 0,51$$

2. Membership value fuzzy set of sales returns variable

$$\mu_{SRLOW}(253) = 1$$

$$\mu_{SRMEDIUM}(253) = 0$$

$$\mu_{SRHIGH}(253) = 0$$

3. Membership value fuzzy set of stock variable

$$\mu_{SLOW}(82) = \frac{113 - 82}{59} = 0,53$$

$$\mu_{SMEDIUM}(82) = \frac{82 - 54}{59} = 0,47$$

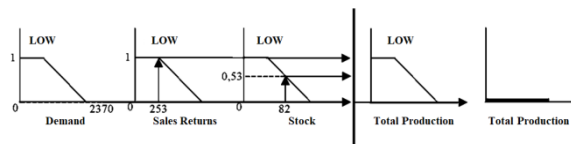
$$\mu_{SHIGH}(82) = 0$$

Application Implication Function

The implication function used is Min function to obtain the α -predicate of first rule up to 27th rule.

[R1] IF D LOW AND SR LOW AND S LOW THEN TP LOW

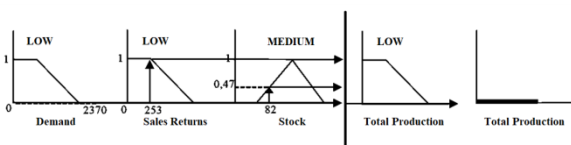
$$\begin{aligned} \alpha\text{-pred}_1 &= \mu_{DL} \wedge \mu_{SR} \wedge \mu_{SL} \\ &= \min(\mu_{DL}(2370), \mu_{SR}(253), \mu_{SL}(82)) \\ &= \min(0, 1, 0,53) \\ &= 0 \end{aligned}$$



Picture 5. Application implication function for R1

[R2] IF D LOW AND SR LOW AND S MEDIUM THEN TP LOW

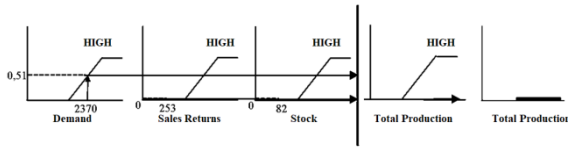
$$\begin{aligned} \alpha\text{-pred}_2 &= \mu_{DL} \wedge \mu_{SR} \wedge \mu_{SM} \\ &= \min(\mu_{DL}(2370), \mu_{SR}(253), \mu_{SM}(82)) \\ &= \min(0, 1, 0,47) \\ &= 0 \end{aligned}$$



Picture 6. Application implication function for R2

[R27] IF D HIGH AND SR HIGH AND S HIGH THEN TP HIGH

$$\begin{aligned} \alpha\text{-pred}_{27} &= \mu_{DH} \cap \mu_{SRH} \cap \mu_{TH} \\ &= \min(\mu_{DH}(2370), \mu_{SRH}(253), \mu_{TPH}(82)) \\ &= \min(0,51, 0, 0) \\ &= 0 \end{aligned}$$



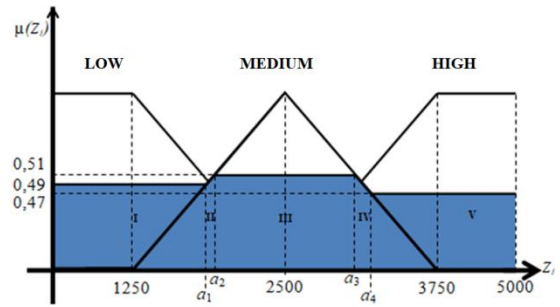
Picture 7. Application implication function for R27

Furthermore, the fuzzy set area with a value of α -predicate not zero can be seen in table 3

Table 3 Interregional fuzzy set result area using first period data

| α -pred | Interregional fuzzy set result area | | |
|---------------------------|-------------------------------------|--|--|
| $\alpha\text{-pred}_{10}$ | | | |
| $\alpha\text{-pred}_{11}$ | | | |
| $\alpha\text{-pred}_{19}$ | | | |
| $\alpha\text{-pred}_{20}$ | | | |

Based on Table 3, we can obtain the results of the composition between rules using the max method. At this stage up to the defuzzification process, the calculation uses the first period data, namely $x_1 = 2370$, $x_2 = 253$, and $x_3 = 82$. The regions resulting from the composition of rules using the 1st period data are obtained based on Table 3 and can be seen in Picture 8.



Picture 8. Curve of result regional inter rules composition using period-1

In picture 8, the results of the inter-rule composition using the 1st period data are divided into 5 parts, namely I, II, III, IV, and V. Then, the values of a_1 , a_2 , a_3 , and a_4 will be searched to make the membership function result composition.

$$\frac{a_1 - 1250}{1250} = 0,49 \quad \leftrightarrow \quad a_1 = 1862,5$$

$$\frac{a_2 - 1250}{1250} = 0,51 \quad \leftrightarrow \quad a_2 = 1887,5$$

$$\frac{3750 - a_3}{1250} = 0,51 \quad \leftrightarrow \quad a_3 = 3112,5$$

$$\frac{3750 - a_4}{1250} = 0,47 \quad \leftrightarrow \quad a_4 = 3162,5$$

Thus, the membership function for the results of the composition between the rules of the first period is as follows:

$$\mu(z_1) = \begin{cases} 0,49 & ; & 0 \leq z_1 \leq 1862,5 \\ \frac{z_1 - 1250}{1250} & ; & 1862,5 \leq z_1 \leq 1887,5 \\ 0,51 & ; & 1887,5 \leq z_1 \leq 3112,5 \\ \frac{3750 - z_1}{1250} & ; & 3112,5 \leq z_1 \leq 3162,5 \\ 0,47 & ; & 3162,5 \leq z_1 \leq 5000 \end{cases}$$

Defuzzification

The defuzzification process in this research uses the Centroid method. In this method, the crisp solution is obtained by taking the center of the fuzzy region. The moment will be calculated for each region, follow by calculation of the area of each area. Finally, the central point is a crisp solution.

a. Calculate moments for each region

$$M_1 = \int_0^{1862,5} (0,49)z_1 dz_1 = [0,245 z_1^2]_0^{1862,5} = 849882,03125$$

$$M_2 = \int_{1862,5}^{1887,5} \left(\frac{z_1 - 1250}{1250}\right) z_1 dz_1 = \left[\frac{1}{3750} z_1^3 - \frac{1}{2} z_1^2\right]_{1862,5}^{1887,5} = 23438,54$$

$$M_3 = \int_{1887,5}^{3112,5} (0,51)z_1 dz_1 = [0,255 z_1^2]_{1887,5}^{3112,5} = 1561875$$

$$M_4 = \int_{3112,5}^{3162,5} \left(\frac{3750 - z_1}{1250}\right) z_1 dz_1 = \left[\frac{3}{2} z_1^2 - \frac{1}{3750} z_1^3\right]_{3112,5}^{3162,5} = 76860,42$$

$$M_5 = \int_{3162,5}^{5000} (0,47)z_1 dz_1 = [0,235 z_1^2]_{3162,5}^{5000} = 3524669,54$$

b. Calculate the area of each area

$$A_1 = 1862,5 \times 0,49 = 912,625$$

$$A_2 = \frac{(0,49 + 0,51) \times 25}{2} = 12,5$$

$$A_3 = 1225 \times 0,51 = 624,75$$

$$A_4 = \frac{(0,47 + 0,51) \times 50}{2} = 24,5$$

$$A_5 = 1837,5 \times 0,47 = 863,625$$

c. Calculate central point as a crisp solution

$$z_1 = \frac{M_1 + M_2 + M_3 + M_4 + M_5}{A_1 + A_2 + A_3 + A_4 + A_5} = \frac{6036725,52}{2438} = 2.476$$

Table 4. Calculations result of Round Bread Productions Using the Fuzzy Mamdani Method

| No | TP PT VB | D | SR | S | TP MAMDANI METHOD |
|----|----------|------|-----|-----|-------------------|
| 1 | 2705 | 2370 | 253 | 82 | 2480 |
| 2 | 2728 | 2326 | 317 | 85 | 2470 |
| 3 | 2710 | 2165 | 448 | 97 | 2480 |
| 4 | 2444 | 1894 | 446 | 104 | 2230 |
| 5 | 2692 | 2333 | 269 | 90 | 2590 |
| . | . | . | . | . | . |
| . | . | . | . | . | . |
| . | . | . | . | . | . |
| 73 | 2532 | 1904 | 507 | 121 | 2530 |

Table 4 meaning production amount using fuzzy mamdani method first period up to 73th periode.

After determining the amount of round bread production using the Mamdani fuzzy method, then calculates the MAPE value. The calculation of MAPE is than by using the production data as be actual data. While the forecasting came from Mamdani fuzzy method.

Table 5. Calculation $\frac{|x_t - F_t|}{x_t}$ first period data up to 73th period

| No | TP PT VB (x_t) | TP MAMDANI METHOD (F_t) | $\frac{ x_t - F_t }{x_t}$ |
|----|--------------------|-----------------------------|---------------------------|
| 1 | 2705 | 2480 | 0,0832 |
| 2 | 2728 | 2470 | 0,0946 |
| 3 | 2710 | 2480 | 0,0849 |
| 4 | 2444 | 2230 | 0,0876 |
| 5 | 2692 | 2590 | 0,0379 |
| . | . | . | . |
| . | . | . | . |
| . | . | . | . |
| 73 | 2532 | 2530 | 0,0008 |

$$\sum_{t=1}^{73} \frac{|x_t - F_t|}{x_t} = 4,3359$$

$$MAPE = \left(\frac{100\%}{73}\right) \sum_{t=1}^{73} \frac{|x_t - F_t|}{x_t} = 5,94\%$$

The MAPE value of the Mamdani fuzzy method was obtained as much as 5.94%, indicates this method has an excellent forecasting ability because the value is less than 10%. Thus, the Mamdani Fuzzy method can be used to determine the amount of rounded bread production at PT Vanessa Bakery.

3. CONCLUSION AND RECOMMENDATION

A. Conclusion

In this research, the application of the Mamdani fuzzy method in determining the amount of round bread production at PT Vanessa Bakery. The calculation of the MAPE value of the Mamdani fuzzy method is 5.94%, which means it has very good forecasting ability.

B. Recommendation

Problems taken in applying the Mamdani fuzzy method in determining the amount of PT Vanessa Bakery round bread production still use three input variables, namely demand, sales returns, and remaining inventory. So that the next research is expected to add input variables, such as the number of workers and production costs, in determining the amount of production.

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