## Forecasting of Export and Import Value of Industrial in Indonesia based on Monte Carlo Algorithm

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## ABSTRACT

Two activities in international trade, namely export and import activities. If the number of exports increases, the value of the domestic currency increases, and the rupiah exchange rate strengthens. The appropriate government policy in determining the economic activity in the plan is to know the priority industry in Indonesia. Forecasting is used to estimate what will happen in the future, based on data in the past. The Monte Carlo method is one of the forecasting methods that can be used. The Monte Carlo method calculates the possibilities that will occur by generating distribution values and intervals of each data that was processed. Random numbers for forecasting simulation have been collected as much as 250 random numbers. Forecasting will also result in the calculation of the Mean Absolute Percentage Error (MAPE) to see how much an error was forecasting. The smallest MAPE value found in for forecasting the export value of Rubber, Rubber and Plastics Products with 0,53%.

#### **General Terms**

Algorithms, Forecasting

## **Keywords**

Forecasting, Monte Carlo Algorithm, Monte Carlo Simulation (MCS)

## **1. INTRODUCTION**

The existence of export and import activities takes a role in the stability of the economy and the amount of foreign exchange. The appropriate government policy in determining the economic activity in the plan is to know the priority industry in Indonesia using the forecasting method. Forecasting is used to estimate what will happen in the future, based on data in the past.

In this research, researchers will implement the method of Monte Carlo Algorithm to forecasting the value of export and import of industry in Indonesia. Researchers use industrial data of 23 industry types based on classification from the International Standard Industrial Classification of all Economic Activities (ISIC) of the Ministry of Industry.

The Monte Carlo method calculates the possibilities that will occur by generating distribution values and intervals of each data that was processed. Forecasting will be followed by calculate the Mean Absolute Percentage Error (MAPE) to see how much an error was forecasting export and import value in Indonesia with the Monte Carlo method. Researchers also created comparison tables between actual data, forecasting value, and Mean Absolute Percentage Error (MAPE).

The main contribution of this research work is expected to be used by the industry and government in setting the target of Indonesia's export and import to the regional medium-term Rodiah Master of Information System Management Faculty of Information System Gunadarma University

Development plan (RPJMN) and the Strategic Plan of the Ministry of Trade.

### 2. LITERATURE REVIEW

Forecasting of export and import value of industrial in Indonesia using Monte Carlo Algorithm has been conducted by several researchers before. Some of these algorithm are discussed below.

Selim Tuzunturk et al [1] did a water demand forecasting using the Monte Carlo simulation to help managerial decisions. The data used is data for water size dispenser (19 liters) from a water company in Bursa. Researchers conducted four different stages of the Monte Carlo simulation to calculate the forecasting of monthly and seasonal water demand.

Dedrizal et al [2] wanted to know the planning of the finished goods inventory at PT. Agrimitra Utama Persada using Monte Carlo simulation. The type of data used in this research is quantitative secondary data, which is data on the number of production and distribution of mineral water in PT. Agrimitra Utama Persada. Before using a Monte Carlo simulation, the researcher conducted forecasting inventory planning using the Naïve, exponential smoothing, Weighted Moving Average, and Moving Average method. The practice of using the Monte Carlo simulation begins with making a probability and variable distribution. The probabilistic value is derived from the calculation of the frequency value divided by the total frequency value.

Alam and Alim [3] made the system to predict the number of foreign tourist visits in East Java using the Monte Carlo simulation method. The data used by researchers is 12 months of data in the year 2016. The research was conducted five times the experiment with different simulation numbers of 50 times, 100 times, 150 times, 200 times, and 250 times. The results of MSE and MAPE calculations for five times the experiment with different simulation numbers, the simulation of 250 times resulted in the smallest MSE and MAPE grades, namely 0.02617 and 0.00087. So it can be concluded that the simulation as much as 250 times can minimize the error of forecasting the foreign tourists visit in East Java.

Suban et al [4] foresaw the needs, expenses, revenues, profits, and average percentages of benefits for the following year using a Monte Carlo simulation with web-based applications, based on a request for a pulse over the previous ten months in Uran Cell. Based on the results of the simulation using the method Monte Carlo, it can be concluded that in one month, Uran Cell can order a balance of 3 (three) times with a capital of Rp. 3.000.000,- and net profit of Rp. 1.830.142,-/month

Putra and Hadi [5] made design applications to calculate the benefits of cigarette products at Nabila stores using the Monte

Carlo method. The built-in Web-based application with PHP programming language and MySql database. This application is expected to provide information about the amount of profit achieved every month and for one year. Inferred in the calculation of Sampoerna Mild 16 products is the profit of Rp. 1,178,600-with, the average profit earned per month is Rp. 117,860,- and the product profit of Sampoerna Green 12 is Rp. 438,900,- With an average profit earned per month of Rp. 43,890,-. This information helps the leadership of the shop Nabila in marketing strategies to face business competition with other stores.

### **3. RESEARCH PROCESS**

In this section will be explained in detail about the research method used to forecast the value of export and import of industrial in Indonesia with the Monte Carlo method. The process stages of this research begins with collecting export and import data, establishing probability distributions, building a cumulative probability distributions, setting random interval, generating random numbers, and simulating the experiment. Then, calculate the Mean Absolute Percentage Error (MAPE) to see how much an error was forecasting export and import value in Indonesia with the Monte Carlo method. Figure 1 illustrates this research methodology.



Fig 1: Research Methodology

## 3.1 Data Collection

This study uses the value of Indonesian Industrial export and import from 2000-2016. Data obtained from the Indonesian Ministry of Industry based on International Standard Industrial Classification of all Economic Activities (ISIC) of 23 industries as follows:

- 1. Manufacture of Food Products
- 2. Manufacture of Beverages
- 3. Manufacture of Tobacco Products
- 4. Manufacture of Textile

- 5. Manufacture of Wearing Apparel
- 6. Manufacture of Leather, Products of Leather and Footwear
- 7. Manufacture of Wood, Products of Wood and Corks, except Furniture, products of woven, rattan, etc.
- 8. Manufacture of Paper and Paper Products
- 9. Manufacture of Printing and Reproduction of Recorded Media
- 10. Manufacture of Coal and Refined Petroleum Products
- 11. Manufacture of Chemicals and Chemical Products
- 12. Manufacture of Pharmaceuticals, Medicinal Chemical, and Botanical Products
- 13. Manufacture of Rubber, Rubber and Plastics Products
- 14. Manufacture of Other Non-metallic Mineral Products
- 15. Manufacture of Basic Metals
- 16. Manufacture of Fabricates Metal Products, except Machinery and Equipment
- 17. Manufacture Computer Electronic and Optical Products
- 18. Manufacture of Electrical Equipment
- 19. Manufacture of Machinery and Equipment n.e.c
- 20. Manufacture of Motor Vehiches, Trailers, and Semi-Trailers
- 21. Manufacture of Other Transport Equipment
- 22. Manufacture of Furniture
- 23. Other Manufacturing

The examples of export data in several manufactures used in this study can be seen in Table 1 for two periods starting from 2000 to 2001.

Table 1. Sample of Export Data in Several Manufacture for Periods 2000-2001

No.	Manufacture	2000 (US\$)	2001 (US\$)
1.	Food Products	3,919,243,556	3,564,998,188
3.	Tobacco Products	157,382,945	194,159,330
4.	Textile	3,630,048,732	3,319,528,043
5.	Wearing Apparel	4,660,426,711	4,440,952,696
6.	Basic Metal	2,172,589,890	1,938,802,256



Fig 2: Flowchart of Input Data for Forecasting

In this study, input data for forecasting began from 2000 to 2016. The process of grouping forecasting data can be seen in Figure 2.

Table 2. Sample of Export Value Data in Manufacture ofRubber, Rubber and Plastics Products from 2000-2016

No.	Year	Export (US\$)
1.	2000	1,851,460,254
2.	2001	1,722,051,310
3.	2002	2,085,942,234
4.	2003	2,728,034,356
5.	2004	3,661,980,762
6.	2005	4,364,576,343
7.	2006	6,379,180,511
8.	2007	7,189,308,905
9.	2008	8,687,694,926
10.	2009	5,855,286,838
11.	2010	10,520,123,401
12.	2011	15,692,703,632
13.	2012	11,820,219,229
14.	2013	10,737,709,520
15.	2014	8,474,758,949
16.	2015	7,156,434,728
17.	2016	6,857,643,793

Table 2 is one of the samples of data sets formed from the collection of forecasting data in the previous process, that is import values in Manufacture of Rubber, Rubber and Plastics Products starting from 2000 to 2016. Data from 2000 to 2015 will use to be input data, while data 2016 as test data.

In this study, forecasting of export and import value of industry in Indonesia based on Monte Carlo method. The Monte Carlo method is divided into five simple steps or can

Monte Carlo method is divided into five simple steps or can be seen in Figure 3. There are establishing probability distributions, building a cumulative probability distributions, setting random interval, generating random numbers, and simulating the experiment [1].



Fig 3: Flowchart of Monte Carlo Method

#### **3.3 MAPE**

Each forecasting method has an error rate, so it is necessary to look up the calculations using the Mean Absolute Percentage Error (MAPE) method that is formulated as follows:

$$MAPE = \frac{1}{n} \sum_{t=1}^{n} \frac{|Y_t - \hat{Y}_t|}{Y_t} x \ 100\%$$
(1)

where:

$$Y_t$$
 = Actual Value,

 $\hat{Y}_t$  = Forecasting Value,

n = Amount of periods.

## 4. EXPERIMENTS AND RESULTS

## 4.1 Monte Carlo Simulation

#### 4.1.1 Establishing Probability Distributions

The first stage of the Monte Carlo method is establishing probability distributions, starting with the calculation frequency of the emergence of values using frequency distribution table.



Fig 4: The Stages of Constructing a Frequency Distribution

Figure 4 explains the stages of contructing a frequency distribution table—After sorting the input data, the lowest data is called  $X_{min}$  and the highest data is called  $X_{max}$ . Next, counting Range data (R) by calculating the difference value

between  $X_{min}$  and  $X_{max}$ .

$$R = x_{max} - x_{min} \tag{2}$$

where:

R=range data,  $X_{\text{max}}=\text{highest}$  data, and  $X_{\text{min}}=\text{lowest}$  data.

Based on Table 2, Range of export value data in Manufacture of Rubber, Rubber and Plastics Products = 15,692,703,632 - 1,722,051,310 = 13,970,652,322. Next, by used Sturges Rules to count the Number of Class Interval (k).

$$k = 1 + 3.3 \log n$$
 (3)

where:

k = number of class interval

n = amount of data.

Number of class interval in Manufacture of Rubber, Rubber and Plastics Products (k) = 1 + 3.3 Log (16) = 4,97 = 4 (rounded). After that, by counting the Length of Class Interval (c) from Range divided by Number of class interval.

$$c = R/k \tag{4}$$

where:

c = length of class Interval

R = range data

k = number of class interval.

So, length of class interval in Manufacture of Rubber, Rubber and Plastics Products (c) = 13,970,652,322 / 4 = 3,492,663,081 (rounded). Class classifying depend on number of class interval (k) and length of class interval (c) can be seen in Table 3. The lower interval for the first class is  $X_{min}$ , while the upper interval class is the lower class + length of class interval. For the next lower interval class (from the second until the last class) is the upper interval + 1, while the upper interval class is the lower class + length of interval class. The last of the upper interval class equals to the  $X_{max}$ .

Table 3. Class Classifying for Manufacture of Rubber, Rubber and Plastic Products

Class	Interva	Midpoint (5)	
Chubb	Lower	Upper	inapoint (c)
1	1,722,051,310	5,214,714,391	3,468,382,851
2	5,214,714,392	8,707,377,473	6,961,045,933
3	8,707,377,474	12,200,040,555	10,453,709,015
4	12,200,040,556	15,692,703,632	13,946,372,094

The midpoint for each class obtained from:

Midpoint = 0.5 (Lower Class + Upper Class) (5)

The last step to constructing a frequency distribution table is counting frequency and delete the class with 0 frequency. The frequency distribution table for Manufacture of Rubber, Rubber and Plastics Products can be seen in Table 4.

 
 Table 4. Frequency Distribution Table for Manufacture of Rubber, Rubber and Plastic Products

Interval Class		Midnoint (4)	f
Lower	Upper	mapoint (4)	5
1,722,051,310	5,214,714,391	3,468,382,851	6
5,214,714,392	8,707,377,473	6,961,045,933	6
8,707,377,474	12,200,040,555	10,453,709,015	3
12,200,040,556	15,692,703,632	13,946,372,094	1
sum			16

After constructing a frequency distribution table, followed by establishing the probability distribution. To establishing the probability distribution is to divide between the number of frequency with the amount of data used. Here is the formula used:

$$Probability Distribution = f/n \tag{6}$$

where: f= frequency

n= amount of data.

Table 5. Probability Distribution Table for Manufacture of Rubber, Rubber and Plastic Products

Interval Class Lower Upper		f	<b>Probability</b>
		J	Distribution
1,722,051,310	5,214,714,391	6	0.375
5,214,714,392	8,707,377,473	6	0.375
8,707,377,474	12,200,040,555	3	0.1875
12,200,040,556	15,692,703,632	1	0.0625
sum		16	1

The probability distribution for manufacture of rubber, rubber and plastic products can be seen in Table 5.

#### 4.1.2 Building a Cumulative Probability Distributions

The second stage of the Monte Carlo method is building a cumulative probability distribution. The cumulative distributions for each class are calculated from the previous cumulative probability and the probability distribution.

#### Cumulative $Prob_n = Prob.Dist_n + \sum Prob.Dist_{n-1}$ (7)

where :

*Cumulative*  $Prob_n$  = cumulative probability of n,

*Prob.*  $Dist_n$  = probability distribution of n,

 $\sum Prob. Dist_{n-1}$  = previous cumulative probability distribution.

The cumulative probability distribution for manufacture of rubber, rubber and plastic products can be seen in Table 6.

Interva	ll Class	<b>Probability</b>	Cumulative Probability	
Lower	Lower Upper		riobability	
1,722,051,310	5,214,714,391	0.375	0.375	
5,214,714,392	8,707,377,473	0.375	0.7500	
8,707,377,474	12,200,040,555	0.1875	0.9375	
12,200,040,556	15,692,703,632	0.0625	1.0000	

# Table 6. Cumulative Probability Distribution Table for Manufacture of Rubber, Rubber and Plastic Products

## 4.1.3 Setting Random Intervals

The third stage of the Monte Carlo method is setting randoms interval number. This study will be generated 10.000 random number. The minimum interval for the first-class equal to 0, while for the others followed by this formula:

 $Min \ Interval_n = Cumulative \ Prob_{n-1} * 10000 \ (8)$ 

 $Max Interval_n = (Cumulative Prob_n *10000)+1 (9)$ 

where :

*Cumulative*  $Prob_n$  = cumulative probability of n

*Cumulative*  $Prob_{n-1}$  = previous cumulative probability

So, the random interval number for manufacture of rubber, rubber and plastic products can be seen in Table 6.

Table 7. Random Interval Numb	ber for Manufacture of
Rubber, Rubber and Pl	astic Products

Midpoint	Cumulative Probability	Minimum Interval	Maximum Interval
3,468,382,851	0.375	0	3750
6,961,045,933	0.7500	3751	7500
10,453,709,015	0.9375	7501	9375
13,946,372,094	1.0000	9376	10000

## 4.1.4 Generating Random Numbers

The fourth stage of the Monte Carlo method is generating random numbers.



Fig 5: Representation of The 250 Collected Random Number



Fig 6: Representation of Actual and Forecasting Export Value for Each Manufacture



Fig 7: Representation of Actual and Forecasting Import Value for Each Manufacture

In this study conducted a random number collection of 250 numbers with existing Randbetween function in Microsoft Excel. The representation of the 250 collected random number can be seen in Figure 5. This random number used to look up the appropriate forecasting reference value on the random interval number table in previous step.

#### 4.1.5 Simulating the Experiment

The last stage of the Monte Carlo method is simulating the experiment. The previously collected random numbers used to find forecasting value. After getting 250 forecasting values based on the random number, the average value is calculated as forecasting value by using the Monte Carlo method. Table 8 shows the sample of forecasting value based on random number and random interval table for forecasting. So, the forecasting of export value in manufacture of rubber, rubber and plastic products is \$6,821,339,410.

#### Table 8. Forecasting of Export Value in Manufacture of Rubber, Rubber and Plastic Products

Simulation	Random Number	Forecasting Value
1	6584	6,961,045,933
2	3746	3,468,382,851
3	4015	6,961,045,933
4	7111	6,961,045,933
5	3183	3,468,382,851
6	9145	10,453,709,015
7	8528	10,453,709,015
8	568	3,468,382,851
9	156	3,468,382,851
10	5451	6,961,045,933
250	3618	3,468,382,851
Average		6,821,339,410

## 4.2 Forecasting Results

#### 4.2.1 Forecasting of Export Value

The following are forecasting result, actual values and MAPE values of export value for each manufacture in Indonesia or can be seen in Table 9 and Figure 6.

<b>Table 9. Forecasting</b>	<b>Result and MAPE</b>	for Export Value
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Manufacture	Actual Data (US\$)	Forecasting Value (US\$)	MAPE (%)
Food Products	26,276,439,451	15,194,654,160	42.17
Beverages	118,029,145	45,819,539	61.18
Tobacco Pro.	959,700,447	479,187,395	50.07
Textile	4,660,053,803	4,190,328,413	10.08
Wearing App.	7,212,686,045	5,747,627,725	20.31

Manufacture	Actual Data (US\$)	Forecasting Value (US\$)	MAPE (%)
Leather	5,014,492,161	2,546,175,489	49.22
Wood	3,755,918,228	3,322,160,248	11.55
Paper	5,067,505,161	4,257,343,499	15.99
Printing	31,561,587	39,990,364	26.71
Coal	634,001	13,073,247	1962.02
Chemicals	10,245,459,510	6,848,415,518	33.16
Comp. Electronic	5,871,650,774	7,361,769,341	25.38
Elect. Equipment	4,576,393,181	3,440,225,771	24.83
Machinery	3,426,295,391	2,101,063,141	38.68
Motor Vehiches	5,141,680,493	2,355,003,924	54.20
Other Transport	2,124,722,151	1,404,947,583	33.88
Furniture	1,617,754,728	1,712,796,507	5.88
Oth.Manufacturing	6,161,074,059	2,075,060,161	66.32

#### 4.2.2 Forecasting of Import Value

The following are forecasting result, actual values and MAPE values of import value for each manufacture in Indonesia or

can be seen in Table 10 and Figure 7.

 Table 10. Forecasting Result and MAPE for Import Value

Manufacture	Actual Data (US\$)	Forecasting Value (US\$)	MAPE (%)
Food Products	9,474,618,313	5,265,595,745	44.42
Beverages	186,585,806	92,563,965	50.39
Tobacco Pro.	462,459,081	290,771,898	37.13
Textile	6,705,393,235	2,856,338,789	57.40
Wearing App.	436,338,448	210,450,489	51.77
Leather	1,144,342,724	541,104,780	54.56
Wood	308,203,933	248,450,258	19.39
Paper	2,670,899,098	2,015,965,890	24.52
Printing	140,498,516	59,253,805	57.83
Coal	102,069,706	49,578,258	51.43
Chemicals	17,742,478,034	12,685,573,903	29.09
Pharmaceuticals	1,283,872,053	628,311,809	51.06
Rubber	3,349,731,829	1,771,233,881	47.12
Oth Nonmetallic	1,218,499,451	717,621,000	41.10
Basic Metals	11,139,234,783	8,512,290,922	23.58
Fabricates Metal	4,503,303,911	2,612,317,105	41.99
Com. Electronic	13,075,981,189	8,231,589,782	37.05
Elec. Equipment	6,655,363,066	3,760,178,618	43.50
Machinery	17,489,796,267	12,249,554,117	29.96

Manufacture	Actual Data	Forecasting	MAPE
	(US\$)	Value (US\$)	(%)
Motor Vehiches	5,316,565,559	4,602,536,289	13.43

Other Transport	2,818,020,233	4,014,026,913	42.44
Furniture	331,140,964	164,875,180	50.21
Oth.Manufacturing	1,685,705,895	779,676,255	53.75

## 5. CONCLUSION

The forecasting of export and import value of the 23 industries in Indonesia in 2016 successfully calculated using the Monte Carlo method based on past data from 2000 to 2015.

The probability distribution, cumulative probability, random interval, and random number for simulation have been determined. Random numbers for forecasting simulation have been collected as much as 250 random numbers.

The error forecasting of export and import value is successfully calculated using MAPE for each industry. The smallest MAPE value in this study was acquired in for forecasting the export value of Rubber, Rubber and Plastics Products with 0,53%.

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