

# Assessing Bank's Efficiency in Indonesia Using Data Envelopment Analysis (DEA) (Evidence from Indonesia in 2008 – 2017)

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#### Abstract:

The purpose of this study is to assess an efficiency analysis of 85 banks in Indonesia by using Data Envelopment Analysis Method throughout 2018 - 2017. From the 85 Banks, it is divided into 5 categories namely Foreign Banks, Mixed Banks, Rural Bank, State-Owned Banks, National Foreign Exchange Banks and National Non-Foreign Exchange Banks. The results showed that during 2018 - 2017 the Bank's efficiency level in Indonesia was at the level of 0.744, more specifically the Rural Bank had the highest efficiency level with an efficiency score of 0.776, followed by Mixed Banks of 0.772, State-Owned Banks at 0.763 and National Private Banks amounting to 0.756. There are two groups of banks that have a level of efficiency score below the average such as Non-Foreign Exchange National Private Banks and Foreign Banks, with efficiency scores of 0.728 and 0.579 respectively.

Keywords: DEA, Efficiency, Indonesia's Banking Industry

## 1. Introduction

The banking industry has a very important position as one of the important components in supporting the progress of the Indonesian economy. Therefore the ability of the banking industry, especially conventional commercial banks to maintain performance and competitiveness, is very important. Based on the SPI report data issued by the OJK in the period 2007 to 2017, in the last decade there has been turmoil in the banking sector of the banking sector. Because the majority of banking companies in Indonesia are currently dominated by conventional commercial banks, the largest companies receive the impact of the utrmoil. In 2007 the total net income of all conventional general banking was Rp. 35,015.00 billion and in 2017 the total net income was 131,144.90 billion. The average profit increases by 17.2% per year. Even though it has advantages that tend to increase every year, the ROA ratio tends to decrease. In 2008 and 2015 there was a

decrease in ROA of -0.45% in 2008 and by - 0.53% in 2015.

The decrease in ROA can be concluded that even though conventional general banking income rises, the ROA value tends to decrease indicating that the banking industry has a decreased ability to generate profits from assets owned, so it is suspected that the banking sector has been inefficient in managing assets owned. One aspect of evaluating the performance of banking companies is the ability to maintain banking efficiency that will be strong against profitability. The efficiency and resilience of the banking industry has an important role in supporting the Indonesian economy. The operational continuity of the Indonesian banking sector will depend on the ability of each banking institution to maintain high competitiveness. This competitiveness can be reflected in the level of efficiency and ability of banks to deal with any disruptions that arise (Muljawan at al., 2014).



In Indonesia research on banking efficiency has been carried out by Alfarisi and Hendrawan (2010, 2012), while in Southeast Asia it was carried out by Wong and Deng (2016) which show that banking efficiency in ASEAN shows that most banks in Malaysia have better efficiency than the other three countries, the two large banks in ASEAN have lower efficiency levels, the three banks The government tends to have better efficiency improvements than private banks.

## 2. Literature Review

Efficiency is one of the benchmarks for evaluating the performance of a company. Evaluation of company performance is carried out on activities carried out in the company in order to run its business. The principle of efficiency in company operations is a comparison between the number of units produced (output) to the number of units used (input). evaluation of So company performance measurements can be described in the form of a ratio of the ratio between outputs with input:

Data Envelopment Analysis (DEA) is a nonparametric method that is used to measure the efficiency level of a unit commonly called a Decisition Making Unit (DMU) using resources (input) and output (output) (Charnes et.al, 1978). DEA is able to measure the level of efficiency using multiple outputs and multiple inputs, this is a difficulty when measuring efficiency using a traditional approach (Cooper et al, 2007). In this study, we will use the CCR model with output oriented. The goal is how maximum the banking company produces maximum output from the current input.

Rahmawati (2015) conducted a study of Sharia Commercial Banks (BUS) in Indonesia using the Stochastic Frontier Approach (SFA) and Data Envelopment Analysis (DEA) methods in the period January 2010 to December 2013. The results of this study concluded that there were differences in the efficiency of BUS with the SFA and DEA method, the average level of efficiency of the BUS uses the SFA method of 85.38% while the DEA is 93.25%.

Radojka et al. (2013) conducted a study to measure the level of banking efficiency in SERBIA. with 33 bank objects using the DEA method. Use two models with different inputoutputs. Model A with inputs: interest expenses, non-interest expenses, and output: net interest income, net non-interest income. While model B with inputs: deposits, employees, and output: net loans and noninterest income. The results of the study show the results of the efficiency levels that differ between the two models.

Said (2013) conducted a study of the relationship between the level of risk and the level of efficiency of Islamic banking companies in MENA (Middle East and North Africa). In this study using three stages, the first stage of measuring the level of efficiency using a nonparametric Data Envelopment Analysis (DEA) technique, the second stage of risk analysis by measuring the level of credit risk, operational and liquidity risk using financial ratios, the third stage measures the correlation between credit, operations and liquidity risk for efficiency using Pearson Correlation Coefficients. The data period used from 2006 to 2009. This study provides results of credit risk and risk has a negative correlation with efficiency, while liquidation risk does not have a significant correlation with efficiency.

Firdaus and Hosen (2013) Conducted research on Islamic Commercial Banks in Indonesia to analyze the factors that affect the level of efficiency between 2010 and 2012 quarterly with a sample of 10 Islamic Commercial Banks. Based on the results of this study it was concluded that overall the development of the level of efficiency of Islamic Commercial Banks has a fluctuating trend because the level of efficiency of individual BUSs is also volatile.

Sufian (2011) conducted a study of banks in Korea with the title Benchmarking the efficiency of the Korean banking sector: a



DEA approach. This study aims to examine the sources of banking inefficiencies in Korea, banks that are the object of 29 banks in the data collection period. from 1992 to 2003. This study uses the Data Envelopment Analysis (DEA) method, uses the input number of employees and physical capital, and uses the output of the number of accounts and the number of transactions. This study provides results that consistently that technical efficiency is higher in the operation approach than the intermediation and valueadded approaches.

Sufian and Habibullah (2010) conducted a study under the title of Development in the efficiency of the Thai banking sector: a DEA approach. This study aims to empirically analyze banking efficiency in Thailand in the period 1999 to 2008. In this study using a sample of 20 bank. Using the Data Envelopment Analysis (DEA) method with input Total Deposits, Fixed Assets, and Labor, and outputs namely loan, investment and NII. The results indicate that banks with higher loan intensity and better capital tend to tend to have higher efficiency. Credit risk negatively affects the efficiency of banks, as well as the global financial crisis negatively impacting Thai banks. Other results indicate that local banks in Thailand have better technical efficiency compared to foreign banks.

Sufian and Noor (2009) conducted a study of Islamic banks in the 16 MENA (Middle East and Nort Africa) sector, using the DEA method to measure efficiency in order to compare the performance of Islamic banking in MENA with Islamic banking in other Asian countries. The conclusion of this research is that Islamic banking in MENA has a higher technical efficiency than other Islamic banks in Asia in the study period and there is a positive relationship between the efficiency of Islamic banking and loans to intensity, size, capitalization, and profitability.

Putri and Lukviarman (2008), measuring the performance of go-to-bank banking in

Indonesia. by optimizing the level of efficiency of commercial banking in Indonesia listed on the Jakarta Stock Exchange using the Data Envelopment Analysis (DEA) method. Using the approach to financial ratios using data from 2002 to 2004. The results of this study indicate that none of the banks consistently operate efficiently in that period. Only Lippo Bank has been able to operate efficiently for 2 years in the 2003-2004 period.

# 3. Methodology

In this study the observation period was carried out during the years 2008 to 2017. With the number of bank samples as many as 85 conventional banks in Indonesia. Input variables to be used are total assets, total deposits and labor costs. While the output variables used are total loans and interest income.

The following is the general equation of the DEA method:

$$hs = \frac{\sum_{i=1}^{m} u_{is} y_{is}}{\sum_{j=1}^{n} v_{js} x_{js}} \dots$$

.....(1)

Where  $h_{s_i}$  it shows the bank's technical efficiency;  $u_{is}$ shows the weight of the output i produced by the bank ;  $y_{is}$  is the amount of output i produced by the bank s;  $v_{js}$  is the weight of input j given by the bank ; and  $x_{js}$  is the amount of input j used by the bank s; i calculated from 1 to m and j is calculated from 1 to n. The equation above shows the use of one input variable and one output. The efficiency ratio (hs) is then maximized with the following constraints:

$$\frac{\sum_{i=1}^{m} u_i y_{ir}}{\sum_{j=1}^{n} v_j x_{jr}} \le 1 \text{ for } \mathbf{r} =$$

1,....,N;  $u_i$  and  $v_j \ge 0....(2)$ 

where N indicates the number of banks in the sample. The first inequality shows that there is no more than 1 efficiency ratio for other DMUs, while the second inequality is



positively weighted. Ratio numbers will vary between 0 to 1, where DMU has an efficient number 1 (100%) and if approaching 0 is increasingly inefficient.

As explained above, there are DEA, CCR and BCC methods, where the DEA general equation derivatives for the DEA CCR model are as follows:

Max. 
$$h_s = \sum_{i=1}^m u_i y_{is}$$
  
st.  $\sum_{i=1}^m u_i y_{ir} - \sum_{j=1}^m v_j x_{jr} \le 0$ ;  $\mathbf{r} = 1, \dots, \mathbf{N}$  .....(3)  
 $\sum_{j=1}^m v_j x_{js} = 1$   
 $\mathbf{u}_i, \mathbf{v}_j \ge 0$ 

The above equation explains that the objective function of the equation is to maximize output with a constraint function

#### 4. Results

that the input value is equal to one, so the output value minus the input value is less than or equal to 0. For the DEA model the BCC is still guided by the general DEA mathematical model and modification of DEA CCR model by adding connectivity constraints to the equation so that the mathematical formula becomes:

Max. 
$$h_s = \sum_{i=1}^m u_i y_{is} + U_0$$
  
st.  $\sum_{i=1}^m u_i y_{ir} - \sum_{j=1}^m v_j x_{jr} \le 0$ ;  $\mathbf{r} = 1, \dots, \mathbf{N}$  ......(4)  
 $\sum_{j=1}^m v_j x_{js} = 1$   
 $\mathbf{u}_i, \mathbf{v}_j \ge 0$ 

where  $U_0$  is a piece that can be positive or negative.

| Ranking | BANK                                     | Efficiency<br>Score |  |  |
|---------|--|---------------------|--|--|
| 1       | THE BANGKOK BANK COMP. LTD               | 0.943               |  |  |
| 2       | BANK RABOBANK INTERNATIONAL<br>INDONESIA | 0.893               |  |  |
| 3       | BANK SUMITOMO MITSUI INDONESIA           | 0.891               |  |  |
| 4       | BANK MIZUHO INDONESIA                    | 0.881               |  |  |
| 5       | BANK KESEJAHTERAAN EKONOMI               | 0.875               |  |  |
| 6       | BPD NUSA TENGGARA BARAT                  | 0.866               |  |  |
| 7       | BANK MESTIKA DHARMA                      | 0.864               |  |  |
| 8       | BANK ARTHA GRAHA INTERNASIONAL           | 0.860               |  |  |
| 9       | BPD SUMATERA UTARA                       | 0.851               |  |  |
| 10      | BPD BALI                                 | 0.851               |  |  |
| 11      | BANK TABUNGAN PENSIUNAN NASIONAL         | 0.850               |  |  |
| 12      | BANK FAMA INTERNASIONAL                  | 0.848               |  |  |
| 13      | BPD BENGKULU                             | 0.843               |  |  |
| 14      | BPD KALIMANTAN TENGAH                    | 0.839               |  |  |
| 15      | BPD SULAWESI TENGGARA                    | 0.838               |  |  |
| 16      | BANK INDEX SELINDO                       | 0.837               |  |  |
| 17      | PRIMA MASTER BANK                        | 0.827               |  |  |

#### Table 1. Efficiency Score Conventional bank in Indonesia from 2008-2017



| 18 | BANK TABUNGAN NEGARA                        | 0.824 |
|----|---|-------|
| 19 | BANK CTBC INDONESIA                         | 0.824 |
| 20 | BANK CIMB NIAGA                             | 0.824 |
| 21 | BANK MAYAPADA INTERNATIONAL                 | 0.821 |
| 22 | BANK JASA JAKARTA                           | 0.819 |
| 23 | BPD SULAWESI UTARA                          | 0.818 |
| 24 | BANK UOB INDONESIA                          | 0.817 |
| 25 | BANK RAKYAT INDONESIA                       | 0.812 |
| 26 | BANK NUSANTARA PARAHYANGAN                  | 0.807 |
| 27 | BPD SUMATERA BARAT                          | 0.807 |
| 28 | BPD JAWA TIMUR                              | 0.801 |
| 29 | BANK SAHABAT SAMPOERNA                      | 0.801 |
| 30 | BANK MASPION INDONESIA                      | 0.801 |
| 31 | BANK DBS INDONESIA                          | 0.792 |
| 32 | BANK RAKYAT INDONESIA AGRONIAGA             | 0.791 |
| 33 | BANK MNC INTERNASIONAL                      | 0.783 |
| 34 | BANK BUKOPIN                                | 0.782 |
| 35 | BANK CHINA CONSTRUCTION BANK<br>INDONESIA   | 0.782 |
| 36 | BANK QNB INDONESIA                          | 0.781 |
| 37 | BPD JAMBI                                   | 0.779 |
| 38 | BPD MALUKU                                  | 0.779 |
| 39 | BANK INA PERDANA                            | 0.778 |
| 40 | BANK DANAMON INDONESIA                      | 0.775 |
| 41 | BANK HARDA INTERNASIONAL                    | 0.771 |
| 42 | BPD KALIMANTAN TIMUR                        | 0.771 |
| 43 | BPD SULAWESI TENGAH                         | 0.768 |
| 44 | PT BANK PEMBANGUNAN DAERAH<br>BANTEN, Tbk   | 0.766 |
| 45 | BPD SUMATERA SELATAN DAN BANGKA<br>BELITUNG | 0.759 |
| 46 | BPD KALIMANTAN BARAT                        | 0.758 |
| 47 | BANK OKE INDONESIA                          | 0.757 |
| 48 | BANK OF INDIA INDONESIA                     | 0.755 |
| 49 | BANK MAYBANK INDONESIA                      | 0.755 |



| 50 | BPD JAWA BARAT DAN BANTEN               | 0.749 |
|----|---|-------|
| 51 | BANK OCBC NISP                          | 0.749 |
| 52 | BANK PERMATA                            | 0.746 |
| 53 | BPD LAMPUNG                             | 0.740 |
| 54 | BPD YOGYAKARTA                          | 0.731 |
| 55 | BANK BISNIS INTERNASIONAL               | 0.730 |
| 56 | BANK AGRIS                              | 0.728 |
| 57 | BANK SINARMAS                           | 0.723 |
| 58 | BPD KALIMANTAN SELATAN                  | 0.718 |
| 59 | THE HONGKONG & SHANGHAI BANKING<br>CORP | 0.717 |
| 60 | BANK ICBC INDONESIA                     | 0.717 |
| 61 | BANK NEGARA INDONESIA                   | 0.712 |
| 62 | BANK HSBC INDONESIA                     | 0.708 |
| 63 | BANK MANDIRI                            | 0.705 |
| 64 | BPD PAPUA                               | 0.705 |
| 65 | BANK CENTRAL ASIA                       | 0.697 |
| 66 | BANK MULTIARTA SENTOSA                  | 0.693 |
| 67 | BANK GANESHA                            | 0.693 |
| 68 | BANK BUMI ARTA                          | 0.689 |
| 69 | BPD RIAU DAN KEPULAUAN RIAU             | 0.689 |
| 70 | BANK SBI INDONESIA                      | 0.675 |
| 71 | BANK COMMONWEALTH                       | 0.675 |
| 72 | BANK ROYAL INDONESIA                    | 0.675 |
| 73 | BANK MAYORA                             | 0.670 |
| 74 | BPD DKI                                 | 0.618 |
| 75 | BANK SHINHAN INDONESIA                  | 0.612 |
| 76 | STANDARD CHARTERED BANK                 | 0.584 |
| 77 | BANK VICTORIA INTERNATIONAL             | 0.576 |
| 78 | BANK NATIONALNOBU                       | 0.573 |
| 79 | BANK AMAR INDONESIA                     | 0.564 |
| 80 | BANK MEGA                               | 0.557 |
| 81 | BANK MITRANIAGA                         | 0.523 |
| 82 | BANK BNP PARIBAS INDONESIA              | 0.493 |
| 83 | JP. MORGAN CHASE BANK, N.A              | 0.437 |

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| 84 | BANK OF AMERICA, N.A | 0.423 |
|----|----------------------|-------|
| 85 | DEUTSCHE BANK AG     | 0.368 |

Based on table 1 above from the results of the efficiency measurements of all samples of Conventional Commercial Banks showing The Bangkok Bank Comp. LTD is a bank that has the highest average efficiency value in the period 2008-2017 with an average efficiency value of 0.94. Followed by Bank Rabobank International Indonesia with an average efficiency value of 0.89.

While Deutsche Bank AG is a bank with the smallest average value of efficiency in the period 2008-2017 with an average efficiency value of 0.37. The lowest efficiency value of Deutsche Bank AG occurred in 2010 with a value of 0.27. second bank of The Bangkok

Bank Comp. LTD and a type of Foreign Bank Deutsche Bank AG. This shows that the types of foreign banks consist of various bank conditions ranging from the most efficient to the most inefficient.

Basically in the DEA method the efficiency calculation process is done by comparing the efficiency of one DMU with the other DMU. Therefore there will always be DMUs who get efficiency score 1, this DMU is given the most efficient predicate. If a DMU gets an efficiency score of 1 it means the bank of the DMU gets the most efficient predicate for that year. Banks that get the most efficient predikit in a given year are presented in table 2 below.

| No | <b>BANK</b>                       | Effi | ciency |      | Type of |      |      |      |      |      |      |   |
|----|-----------------------------------|------|--------|------|---------|------|------|------|------|------|------|---|
| NU |                                   |      | 2009   | 2010 | 2011    | 2012 | 2013 | 2014 | 2015 | 2016 | 2017 | BANK                                      |
| 1  | THE BANGKOK BANK<br>COMP. LTD     | 0.96 | 0.94   | 0.86 | 1.00    | 1.00 | 1.00 | 0.86 | 0.99 | 1.00 | 0.81 | Foreign Bank                              |
| 2  | BANK SUMITOMO MITSUI<br>INDONESIA | 0.85 | 0.71   | 0.89 | 0.89    | 0.85 | 0.87 | 0.95 | 0.93 | 1.00 | 1.00 | Mixed Bank                                |
| 3  | BANK MIZUHO INDONESIA             | 0.92 | 0.78   | 0.78 | 0.81    | 0.91 | 0.89 | 0.95 | 0.83 | 1.00 | 0.95 | Mixed Bank                                |
| 4  | BANK KESEJAHTERAAN<br>EKONOMI     | 0.99 | 1.00   | 0.92 | 0.88    | 0.80 | 0.82 | 0.82 | 0.83 | 0.83 | 0.85 | National Non<br>Foreign-<br>Exchange Bank |
| 5  | BPD NUSA TENGGARA<br>BARAT        | 1.00 | 0.92   | 0.90 | 0.93    | 0.88 | 0.89 | 0.82 | 0.87 | 0.78 | 0.67 | Rural Bank                                |
| 6  | BANK MESTIKA DHARMA               | 0.95 | 1.00   | 0.92 | 0.82    | 0.87 | 0.91 | 0.84 | 0.85 | 0.75 | 0.73 | National Foreign-<br>Exchange Bank        |
| 7  | BANK ARTHA GRAHA<br>INTERNASIONAL | 0.88 | 0.82   | 0.76 | 0.81    | 0.86 | 0.84 | 0.84 | 0.79 | 0.99 | 1.00 | National Non<br>Foreign-Exchange<br>Bank  |
| 8  | BPD SUMATERA UTARA                | 0.95 | 1.00   | 0.86 | 0.71    | 0.84 | 0.88 | 0.86 | 0.85 | 0.81 | 0.76 | Rural Bank                                |
| 9  | BANK DBS INDONESIA                | 0.71 | 0.62   | 0.78 | 0.79    | 0.78 | 0.77 | 0.73 | 0.76 | 0.97 | 1.00 | Mixed Bank                                |
| 10 | BPD JAMBI                         | 0.87 | 0.85   | 1.00 | 0.73    | 0.73 | 0.84 | 0.73 | 0.69 | 0.66 | 0.67 | Rural Bank                                |
| 11 | BANK OKE INDONESIA                | 0.38 | 0.40   | 0.50 | 0.81    | 0.92 | 1.00 | 0.85 | 0.80 | 1.00 | 0.91 | Non Foreign-<br>Exchange Bank             |

Table 2. The most efficient bank in 2008-2017



| 12 | THE HONGKONG &<br>SHANGHAI BANKING CORP | 0.66 | 0.75 | 0.65 | 0.65 | 0.69 | 0.70 | 0.76 | 0.71 | 0.60 | 1.00 | Foreign Bank                  |
|----|---|------|------|------|------|------|------|------|------|------|------|-------------------------------|
| 13 | BANK NATIONALNOBU                       | 1.00 | 0.76 | 0.52 | 0.56 | 0.39 | 0.38 | 0.49 | 0.60 | 0.52 | 0.52 | Non Foreign-<br>Exchange Bank |

Based on the data in table 2 above, it shows that 2016 and 2017 are the years where most banks get efficiency score of 1, which is as many as four banks each year, whereas in 2014 and 2015 there is absolutely no bank that gets efficiency score 1.

| Tipe of BANK  |       | Average |       |       |       |       |       |       |       |       |       |
|---------------|-------|---------|-------|-------|-------|-------|-------|-------|-------|-------|-------|
| r             | 2008  | 2009    | 2010  | 2011  | 2012  | 2013  | 2014  | 2015  | 2016  | 2017  |       |
| Rural Bank    | 0.751 | 0.799   | 0.796 | 0.716 | 0.721 | 0.813 | 0.803 | 0.815 | 0.793 | 0.756 | 0.776 |
| Mixed Bank    | 0.781 | 0.693   | 0.679 | 0.716 | 0.802 | 0.785 | 0.772 | 0.786 | 0.859 | 0.849 | 0.772 |
| State-owned   |       |         |       |       |       |       |       |       |       |       |       |
| Bank          | 0.716 | 0.713   | 0.743 | 0.726 | 0.755 | 0.802 | 0.793 | 0.808 | 0.794 | 0.784 | 0.763 |
| National      |       |         |       |       |       |       |       |       |       |       |       |
| Foreign-      |       |         |       |       |       |       |       |       |       |       |       |
| Exchange Bank | 0.746 | 0.728   | 0.743 | 0.743 | 0.780 | 0.788 | 0.766 | 0.759 | 0.758 | 0.745 | 0.756 |
| Non Foreign-  |       |         |       |       |       |       |       |       |       |       |       |
| Exchange Bank | 0.734 | 0.715   | 0.656 | 0.703 | 0.731 | 0.749 | 0.741 | 0.763 | 0.765 | 0.718 | 0.728 |
| Foreign Bank  | 0.575 | 0.574   | 0.520 | 0.535 | 0.582 | 0.632 | 0.605 | 0.589 | 0.572 | 0.602 | 0.579 |
| Overall       | 0.735 | 0.729   | 0.717 | 0.709 | 0.741 | 0.776 | 0.761 | 0.767 | 0.767 | 0.744 | 0.744 |

Table 3. Efficiency score based on type of bank

Based on the data in table 3 it can be seen that BPD rural banks have the highest average efficiency level of 0.776, followed by mixed banks with an average efficiency value of 0.772, then state-owned banks with an average efficiency value of 0.763, National Foreign- Exchange Bank with an average efficiency value of 0.756, Non Foreign-Exchange Bank with an average efficiency value of 0.728, and finally Foreign Bank with an average efficiency value of 0.579.

## 5. Conclusion and Implications

Based on the data from the research and analysis of the calculation of the efficiency value of Conventional Commercial Banks in Indonesia in the period 2008-2017 using the DEA method, the conclusions that can be obtained by researchers are as follows: 1. The efficiency conditions of Conventional Commercial Banks in Indonesia in the period 2008-2017 were very diverse, some banks had very good efficiency such as The Bangkok Bank Comp. LTD with an average efficiency of 0.943, but there are also banks with very low average efficiency values such as Deutsche Bank AG with an average efficiency value of 0.368.

2. On average rural is the most efficient type of bank from all other types of banks with an average efficiency value of 0.776 throughout the period 2008-2017. The rural with the highest average efficiency value is BPD West Nusa Tenggara with an average efficiency value of 0.866, while the BPD with the lowest average efficiency value is DKI BPD with an efficiency value of 0.538 on average during the period 2008-2017.



3. Foreign Bank is the type of bank that has the most diverse efficiency value, the bank with the highest efficiency among all sample banks is The Bangkok Bank Comp. LTD with an average efficiency value of 0.943 and the lowest efficiency bank among all sample banks is Deutsche Bank AG with an average efficiency value of 0.368, both banks including Foreign Banks.

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