

Alternative Performance Measurement for Road Management Agencies Using Data Envelopment Analysis Method

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Abstract

Performance assessment is the most important phase in each organization cycle to determine whether the organization has been functioning in accordance to the fundamental purpose of the organization existence. This is also true for the National Road Implementation Agencies (BBPJB/BPJB) as the technical supporting units of the Directorate General of Bina Marga - Ministry of Public Works that are responsible for the maintenance and functioning of the national roads in Indonesia. As public institution, currently BBPJBs and BPJBs are accountable for their performances and to be assessed in accordance to government assessment mechanism using Performance Report of Government Institution - LAKIP. Departing from some weakness on the current mechanism, this paper is to discuss the development a performance assessment model using DEA (Data Envelopment Analysis) approach as a complementary model to the existing performance measurement model. Using DEA approach, relative efficiency amongst road agencies can be compared, which will then can be utilized as the basis for decision by the Directorate General of Bina Marga on BBPJB/BPJB's future workplan and budgeting.

Keywords: Road services agencies, Performance assessment model, DEA.

Abstrak

Pengukuran kinerja merupakan tahap yang paling penting dalam setiap siklus organisasi untuk mengetahui apakah organisasi tersebut telah berfungsi dengan baik sesuai dengan tujuan keberadaannya. Hal serupa juga berlaku bagi Balai dan Bali Besar Pelaksanaan Jalan Nasional, yang merupakan organisasi di lingkungan Direktorat Jenderal Bina Marga - Kementerian Pekerjaan Umum yang berfungsi dan bertanggungjawab terhadap pemeliharaan dan penyelenggaraan jalan nasional di Indonesia. Sebagai instansi publik, saat ini kinerja BBPJB dan BPJB perlu dinilai dan dituntut pertanggungjawabannya melalui mekanisme Laporan Kuntabilitas Kinerja Instansi Pemerintah (LAKIP). Berangkat dari kelemahan-kelemahan LAKIP, makalah ini membahas pengembangan model penilaian kinerja dengan pendekatan analisa selubung data - DEA, sebagai model pendukung untuk menilai kinerja BBPJB/BPJB. Penggunaan pendekatan DEA, efisiensi relatif antara Balai/Balai Besar dapat dibandingkan, yang selanjutnya dapat digunakan sebagai landasan pengambilan keputusan bagi Direktorat Jenderal Bina Marga untuk menyusun rencana kerja dan anggaran mendatang bagi Balai/Balai Besar tersebut.

Kata-kata Kunci: Unit penyelenggaraan jalan, Model penilaian kinerja, DEA.

1. Introduction

Roads, as part of the transportation infrastructure system, are one of the most demanded public infrastructures that they function to essentially connect one area to another. In Indonesia, such important role of road is legally stated in Law no 38 - 2004 on Roads, Part III on Roles, Categorization, and Parts of Roads, section 1, article 5 concerning Role of Roads. Law states that roads do not only play important role in all areas, but also be part of goods and service distribution infrastructure, which is the main vein of public life, the nation, the state, and the link and unity of the whole

Republic of Indonesia. Further, road network as part of the national transportation system hold important role, especially in supporting the economy, social-cultural, political, as well as the national security. With respect to those issues, the government has the responsibility to provide reliable road infrastructure system. Such responsibility is part of the duty of the Directorate General Bina Marga (DGBN), Ministry of Public Works.

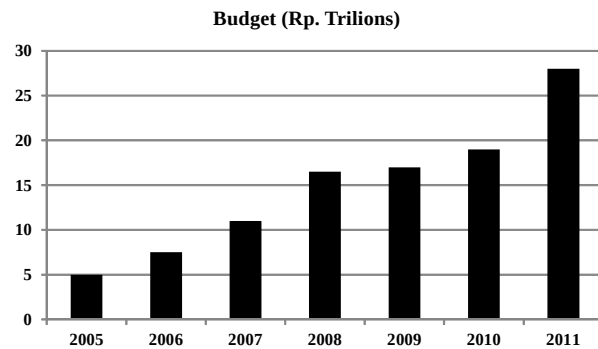
In efforts to provide and maintain the reliable service of road system, several technical operational units, called Balai Besar Pelaksanaan Jalan Nasional

(BBPJN) and Balai Pelaksanaan Jalan Nasional (BPJN), are set up to support the Directorate General Bina Marga. According to the Ministry of Public Works regulation no 21/PRT/M/2010 on Organization and Technical Implementation Units, article 114 and 158, BBPJN and BPJN have the duties of executing the national road management system. This system consists of planning, procurement, improvement of capacity and preservation of national roads, quality control, as well as providing necessary materials and equipment needed for road and bridge works.

As part of the government institutions, the existences of these units are subjected to performance evaluation, as to determine how effective they are in meeting the organization's objective, in performing their duties and responsibilities. Moreover, such evaluation is also necessary to decide whether the utilization of all budgeted resources are efficient. Efficiency is one many important performance measurements in road management system, especially in a national scale, since involves a very large sum of money.

To illustrate the magnitude of DGBN budget for national road system, Roadmap for Bureaucratic Reforms of DGBN 2010-2014 stated that the government has significantly increased the budget allocation for national road system from Rp. 6.02 trillion in 2005 to Rp. 28.7 trillion in 2011. As shown in **Figure 1**, this represented an increase of more than fivefold in 6 years period, making it the largest budget within the Ministry of Public Works. However, such an increase in budget is not always necessarily accompanied by optimum realization of the plans.

Similar to other government institutions, at the national level the performance of BPJN and BPJN are assessed by using LAKIP instrument, which measure the level of achievement of several performance indicators previously set. LAKIP, an acronym of "Laporan Akuntabilitas Kinerja Instansi Pemerintah" or Performance Accountability Report for Government Institutions, is an instrument used by the government to audit the performance of government institutions that uses the ratio of realization and planned performance of some indicators. Using the instrument the government audit can measure the rate of effectiveness of such institution



source: Roadmap for bureaucratic reform Directorate General of Bina Marga 2010-2014

Figure 1. APBN allocation for directorate general of Bina Marga

in achieving the target, but is deemed failed to recognize how efficient was the institution in using its resources, including allocated funding budget, to reach those achievements.

However, this instrument has limitations, that in its current form, LAKIP is unable to accommodate or recognize the variation of delivery level of road services due to different characteristics, workloads, and service capacities of national road system of each BBPJN and BPJN into its measurement system. Each BBPJN or BPJN has different size of road length that needs to be built and maintained, different geographic characteristics, local development stage, as well as different sizes of equipment fleet and other resources. To accurately measure the individual BBPJN's or BPJN's performance, the measuring instrument must also be able to accommodate such differences, and surely, those differences should be taken into account when comparing the performance of one BBPJN or BPJN to the others.

This paper proposed DEA (*Data Envelopment Analysis*) model as alternative instrument for measuring the efficiency of BBPJN/BPJN, because it is deemed capable of comparing efficiency levels amongst BBPJN/BPJNs. DEA model is a widely used management tool to solve complex efficiency measurement as applied in a variety of area, ranging from health and education, to banking and engineering, to road management system.

Table 1. Example of LAKIP performance evaluation indicators for road management system

Goals	Performance Indicators	Targets	Realizations	Rate of Achievements
Improvement of Quality Service in National Road and Management of Local Roads	Outcome indicators			
	Rate of Road Utilization	84.6 million vehicles-kilometres	84.6 million vehicles-kilometres	100,21%
	Output Indicators:			
	Length of roads with routine maintenance	34.879 Km	33.855 Km	97%
	Length of bridges with routine maintenance	191.913 m	200.329 m	104%

Source: LAKIP Bina Marga (2011)

2. Data Envelopment Analysis

Data Envelopment Analysis (DEA) method is a management tool for evaluating the performance of working entities or organizations, which is widely used in a variety of areas from schools, hospitals, to banking and product manufactures (Charnes *et al.*, 1994). This method was first coined by Charnes, Cooper dan Rhodes (Charnes *et al.*, 1978), and soon became a popular quantitative method for measuring relative efficiency of a homogenous group of decision-making units - DMUs. In general, DMU is the object of analysis that can be assumed as unit or entity responsible for converting inputs into outputs.

DEA is categorized into *frontier analysis* method, that estimates the maximum output from a given input (*output oriented*), or minimum input for a desired level of output (*input oriented*), which will be used as boundary or benchmark for combinations of input-output of a unit under study. The value of this estimate, called relative efficiency, is the result of relative comparison amongst units under study, which will also change if the compositions of units are changed too (Cooper *et al.*, 2000).

Efficiency value in the forms of multiple inputs and multiple outputs is formulated as:

$$\text{Efficiency} = \frac{\text{sum of weighed output}}{\text{sum of weighed input}} \quad (1)$$

The simplest model of DEA formulation is the CCR model (Charnes *et al.*, 1978), which consists of the sum of weighted outputs over the sum of weighted inputs. For n DMU, for each DMU under study, the efficiency score can be determined from:

$$\max p = \frac{\sum_{k=1}^s v_k y_{kp}}{\sum_{j=1}^m u_j x_{jp}} \quad \text{subject to} \quad \frac{\sum_{k=1}^s v_k y_{ki}}{\sum_{j=1}^m u_j x_{jp}} \leq 1 \quad \forall i$$

$$v_k, u_j \geq 0 \quad \forall k, j, \quad (2)$$

In a *linear programming*, it is formulated as follows:

$$\max p = \sum_{k=1}^s v_k y_{kp} \quad \text{subject to} \quad \sum_{j=1}^m u_j x_{jp} = 1 \quad \forall i \quad (3)$$

$$\sum_{k=1}^s v_k y_{ki} - \sum_{j=1}^m u_j x_{ji} \leq 0$$

$$v_k, u_j \geq 0$$

$$\forall k, j,$$

where, p = relative efficiency score of DMU_i ; s = number of output factors; m = number of input factors; v_k =

output weight k ; u_j = input weight j ; y_{ki} = number of output k by DMU_i ; x_{ji} = number of input j by DMU_i

The objective is to determine the weights (v_k) dan (u_j) through maximization the efficiency ratios of DMU_i , by limiting the efficiency ratios (derived from the above-mentioned formula), for each DMU not to exceed 1, and the weights of (v_k) dan (u_j) cannot be negative (> 0). That formulation is repeated for n DMU.

The need for performance measurement models for road management agencies has been discussed for quite sometimes (Wei and Schonfeld, 1998). DEA modeling technique as alternative instrument for measuring performance of road delivery and maintenance has been proposed in various studies by Fallah-Fini *et al.* (2009); TRB (2009; Wang, and Tsai (2009), Ozbek *et al.* (2010), and Wei, *et al.* (2011). Those studies concluded that DEA model could be applied as instrument for relatively measure how efficient is a unit or organization in performing its function in delivering and maintaining roads, in comparison to other similar units or organizations.

3. Selection of Input and Output Factors

In DEA, all types of input and output factors can be incorporated into the model, be it a very simple factor or the most complex ones, because DEA does not discriminate a factor specific priority in the analysis. All factors have equal impact on output of the analysis (Ozbek *et al.*, 2010). Therefore, the establishment of input and output factors is the most important process in using DEA. Such an establishment is subjective, dependent on the discretion of the person and the availability of data. Nonetheless, fundamentally the selection of input and output factors should have direct association with the objective, the process run by, as well as to have significant impact on the attainment of level of efficiency of the DMU under study.

The number of input and output factors should be carefully determined before applying DEA; so that such number will be appropriate with the number of DMUs under study. DEA model that accommodates a large number of input and output variables tends to move DMUs toward frontier efficient, making DMUs under study to have the high efficiency values (Ozbek *et al.*, 2010). Some researchers have proposed some rules of thumb regarding the allowable number of input-output factors based on the number of DMUs:

- Avikiran (1984) and Darrat *et al.* (2002) suggested that the multiplication of input and output factors should not be greater than the number of DMU;
- Ramanathan (2003) proposed the number of samples (DMUs) must be twice or three times larger than the sum of input and output factors; whereas

- c. Boussofiane *et al* (1991) and Dyson *et al* (2001), proposed the minimum number of DMU must be equal to $2mt$, where m = number of input factors, and t = number of output factors.

However, it is advisable to set the number of input-output variables as low as possible, so that DEA model can produce the best analysis without losing dominant variables in determining the DMUs' efficiency levels. (Ozbek *et al*, 2010).

The following table depicts input and output factors used in evaluation BBPJJN/BPJN's efficiency:

Table 2. DEA input and output factors

Input Factors	Output Factors
Budget (Rp. million)	Road improvement realization ratio
Number of staffs (person)	Road maintenance realization ratio
Value of asset (Rp. million)	Budget realization (Rp. million)
Number of working units – sub-unit (unit)	
Location factor (hard, average, easy)	

The selection of input and output factors was based on the duty and function of BBPJJN/BPJN such as depicted in article 114 and 158 Ministry of Public Works Regulation no No.21/PRT/M/2010 about the organization and working system of Ministry of Public Works' technical implementing units (UPT), in particular which is related to improve the capacity and preservation of national road.

The main objective of BBPJJN/BPJN's activities is to guarantee the achievement of maintenance and improvement of national road in each BBPJJN/BPJN's authority - output factors, using available or given resources - input factors.

3.1 Input factors

The set of input factors consist of five factors:

- Budget which represents fund allocated to BBPJJN/BPJN, and all units under it subordination, to perform its duty to deliver and maintain the national road networks.
- Number of employee includes all permanent technical and administrative staffs belong to BBPJJN/BPJN and all of its subordinates, but to exclude those of temporary employees or outsourced staffs, and are measured in number of person.
- Value of asset represents the total value of asset owned by BBPJJN/BPJN and all working units

under its subordination that is deemed to directly and indirectly influence the capability of this unit to function. Asset includes tangible asset such as machineries, buildings, roads and bridges, and intangible asset such as software and licenses recorded in the inventory list of Ministry of Finance (government property), and is measured in monetary unit.

- Number of working units (subordinate) reflects the number of working or implementing unit under direct coordination of BBPJJN/BPJN.
- Location factor, this factor is to represent the degree of difficulty faced by each unit in performing its full duties, which is to reflect the characteristics of geographic dispersion, soil conditions, topography, and the degree of regional economic and social development.

Geographic dispersion was meant to represent the specific characteristics of the region at which BBPKN/BPJN has the authority, whether its region is mainly is located in a vast land area or dispersed of several islands. This geographic characteristic will impact the mobilization and demobilization of road equipment of transportation of other resources into the sites. Soil condition and topography are supposedly representing the variability of soil characteristic in each BBPJJN/BPJN working area.

The degree of regional development represents the maturity of the region in terms of its economic and social aspects, which should reflect the ability to absorb program and achieve the objective of improving and maintaining roads. It should be apparent that BBPJJN/BPJN in an isolated location will be less capable in handling the works as opposed those in developed area. The degree of difficulty in implementing road improvement and preservation based on location factor is measured subjectively using simple assessment scale 1 to 3, with 1 for high difficulty, 2 for low difficulty, and 3 for in between. The application of such as simple measuring scale has been used by Ozbek (2007) to quantify the effect of regional factors for bridge maintenance program. The geographic map depicted in figure 3, shows the area of responsibility of each BBPJJN/BPJN, which is used to assign difficulty value, based on the rating as shown in table 2. Value of 3 was assigned for Balai IV-Jakarta and Balai V-Surabaya because they are located in relative flat land, in Java Island which is considered as the most advanced area in Indonesia. Such situation makes the transportation of resources and implementation of road improvement and preservation much better than other location.

In contrast, difficulty value of 1 was given to Balai VIII-Denpasar and Balai IX-Ambon for the fact that they are located in small islands that makes mobilization and demobilization of equipment more problematic. Balai X-Jayapura was also rated difficult, since its working zone is mostly in mountainous and isolated areas, with very limited access to land transportation. The rest of BBPJM/BPJM were rated moderate, because they are not located in developed area such as in Java Island but they are not also not located in a very bad location as well.

3.2 Output factors

- Budget realization which reflects the accumulated funds used to execute duty and responsibility of BBPJM/BPJM to achieve the predefined targets.
- Road improvement realization ratio. This ratio represents the proportion of total length of road improved or upgraded as compared to planned quantity in any given budget year.
- Road maintenance realization ratio. This ratio represents the proportion of total length of road being

maintained in a year as compared to planned quantity in any given budget year.

Maintenance works for national roads include routine maintenance and scheduled rehabilitation, whereas improvement works comprise of reconstruction or betterment of road structural elements, widening and construction of new roads.

It should be noted that according Law no 38 – 2004, and Government Regulation no 34, 2006 on roads, bridges, along with tunnels, underpasses, and flyovers, are included in road system, and therefore they are also included in the measurement of BBPJM/BPJM performance. In this DEA model, these structures are excluded from the performance assessment.

This research focused on the effectiveness of money spent on the activities. Unlike physical realization, budget realization was not calculated in term of ratio of money spent over available budget. Budget realization was measured in money spent over a given budget year, whereas the amount of budget itself was already measured as input factor.

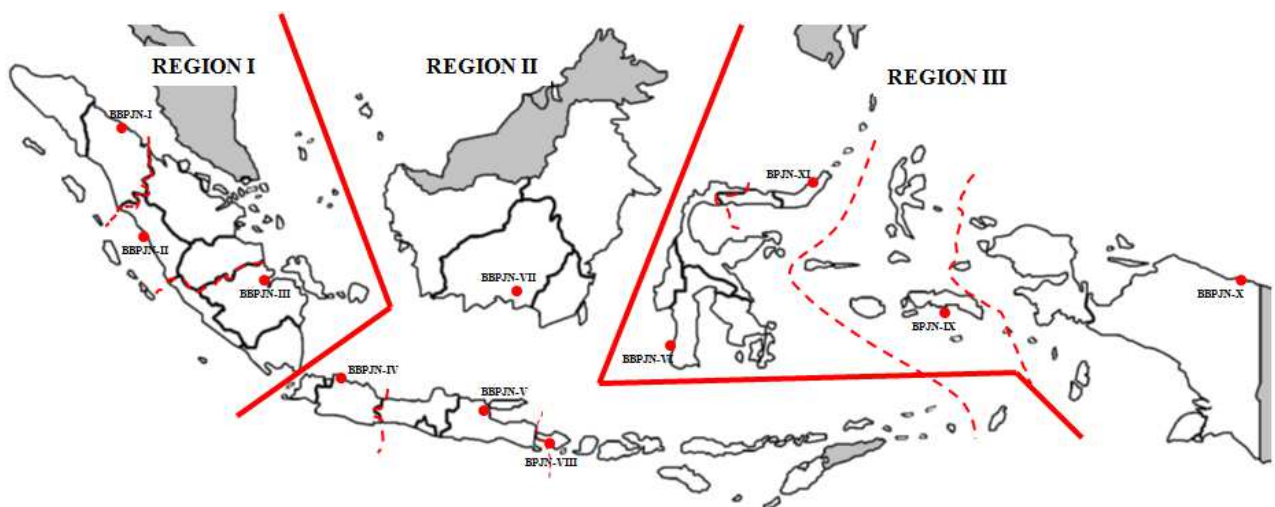


Figure 2. Geographic area of responsibility of BBPJM/BPJM

Table 1. Location factor - difficulty level

Scale (rate of difficulty)	Indicators	DMU
1 (High)	Mostly located in small islands highland/mountainous terrain, or in bad soil condition Mostly located in under-developed region	BBPJM X-Jayapura BPJM VIII-Denpasar BPJM IX-Ambon
3 (Low)	Mostly located in large island, low land and with relatively good soil condition. Mostly located in highly-developed region	BBPJM IV-Jakarta BBPJM V-Surabaya
2 (Moderate)	In between	BBPJM I-Medan BBPJM II-Padang BBPJM III-Palembang BBPJM VII-Banjarmasin BBPJM VI-Makassar BPJM XI-Manado

Table 2. Efficiency Scores for BBPJN/BPJN

DMUs	Efficiency Scores (e)	Ranks	Rating
BBPJN I - Medan	100%	1	Excellent
BBPJN II - Padang	96,58%	3	Very good
BBPJN III - Palembang	100%	1	Excellent
BBPJN IV - Jakarta	90,49%	4	Good
BBPJN V - Surabaya	100%	1	Excellent
BBPJN VI - Makassar	83,68%	5	Good
BBPJN VII - Banjarmasin	100%	1	Excellent
BBPJN X - Jayapura	100%	1	Excellent
BPJN VIII - Denpasar	99,37%	2	Very good
BPJN IX - Ambon	100%	1	Excellent
BPJN XI - Manado	100%	1	Excellent

rating: excellent (100%), good (80-99%), fair (65-80%)

Table 3. Input-Output Factors for BBPJN/BPJN

Decision Making Units (DMUs)	Input Factor				Output Factor			
	Budget (Rp. Mill)	No of Employee	Value of Assets (Rp. Mill)	Number of Implementing Units	Location Factors	Ratio of Road Maintenance Realization	Ratio of Bridge Maintenance Realization	Budget Realization (Rp. Mill)
Balai I - Medan	1,822,860	572	29,878,181	11	2	0.940	1.020	1,605,886
Balai II - Padang	2,071,234	456	25,647,022	16	2	1.178	0.684	1,744,095
Balai III - Palembang	1,600,310	613	25,882,792	18	2	0.998	2.221	1,759,388
Balai IV - Jakarta	1,640,148	646	58,612,410	20	3	1.016	1.125	1,630,232
Balai V - Surabaya	2,757,283	627	72,532,486	16	3	1.039	0.753	2,514,319
Balai VI - Makassar	1,951,782	949	24,767,296	19	2	1.000	0.857	1,753,150
Balai VII - Banjarmasin	2,917,114	776	39,488,782	21	2	1.126	0.923	2,909,670
Balai VIII - Denpasar	2,019,070	661	26,909,623	18	1	1.000	0.233	1,737,208
Balai IX - Ambon	844,617	232	3,870,187	11	1	0.990	0.981	818,406
Balai X - Jayapura	1,951,229	270	16,201,353	19	1	1.009	1.101	2,111,683
Balai XI - Manado	795,458	340	8,456,662	9	2	0.990	0.990	866,425
Total	20,371,105	6,142	332,246,794	178				19,450,462

4. Performance Assessment using DEA Method

To illustrate the application of DEA model, data gathered from performance report from Directorate General of Bina Marga - Ministry of Public Works year 2011, which compiled report from all BBPJNs/BPJNs, will be used. The results are shown in **Table 4**.

In total, 7 DMUs were rated very good, scoring maximum efficiency (100%), which are BBPJN I Medan, BBPJN III Palembang, BBPJN V Surabaya, BBPJN VII Banjarmasin, BBPJN VIII Denpasar, BPJN IX Ambon, and BPJN XI Manado. Two DMUs scored relatively good (80-99%), which are BBPJN II Padang and BPJN VIII Denpasar, whereas the other two DMUs scored between 80-95%, which are BBPJN IV Jakarta and BBPJN VI Makassar (83,68%, the lowest). In general, all BBPJNs and BPJNs can be considered efficient.

5. Analysis

The focus of analysis is to recognize whether different BBPJN/BPJN is performing differently according to its individual workloads and geographic characteristics, as well as to determine which BBPJN or BPJB is performing in the most efficiency way in producing realizing output for a given set of input. Since not all BBPJNs and BPJNs are equipped with the same organization elements, it is necessary to take into account such differences in comparing performance amongst BBJNs and BPJNs.

In addition to group of BBPJN and BPJN, the organizational structure of the technical implementation units under Directorate General of Bina Marga is also distinguished by the size and elements of organization. According to Ministry of Public Works Regulation no 21 – 2000, type A organization is composed of slightly larger and higher hierarchical structure to accommodate the function and responsibility to carry out loads of implementation (road improvement and rehabilitation) than that of type B. (see figure 3).

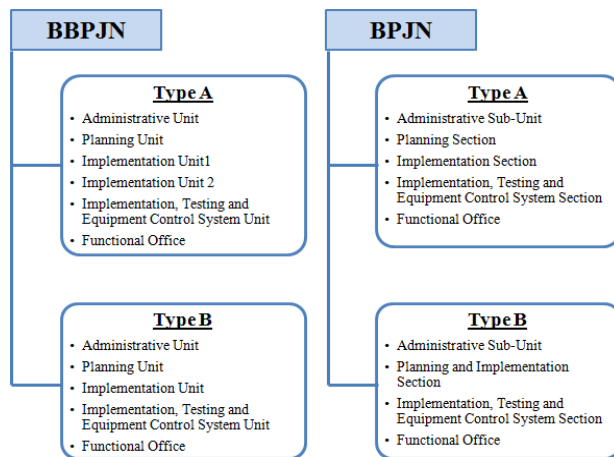


Figure 3. Organizational structures of BPPJN and BPJN

5.1 Type of DMU

In calculating the efficiency, this DEA model did not make any distinction between efficiency scores made by BBPJNs to those of the BPJNs. Although they have different workloads and organization structures, they are still functioning and having the same objectives; that is providing good and reliable national roads. In general, workloads and responsibility borne by BBPJN is considered more complex than those borne by BPJN, so it requires a more comprehensive structure with more tasks specific. Judging from their geographical characteristics, the area of responsibility of BBPJN is much broader than BPJN, whereas almost all BPJNs are in the region of small islands (Bali, NTB, NTT, Maluku and North Maluku).

As shown in their efficiency values in **Figure 4**, on the average BPJNs' performances are relatively higher than those of BBPJNs. Out of eight BBPJNs, only four BBPJNs scored excellence relative efficiency. This is lower than that of BPJNs that have two BPJNs rated excellence out of three BPJNs. BPJN VIII Denpasar scored second best efficiency, so that the overall performance of BPJN was relatively better than BBPJN. Such a higher accomplishment was possible since the complexity and workloads of BPJN is in general lower than what BBPJN should cover.

The performance of BBPJN and BPJN does not seem to be influenced by the type of organization. The efficiency scores of type A and type B BBPJN are almost identical. Type B BBPJN has more DMUs with high efficiency than type A BBPJN that makes the average relatively high. On the other side, high average efficiency performance of type B BBPJN can also be attributed to the fact that the total number of DMU in type B BBPJN is larger than type A. Similarly, type A BPJN and type B BPJN have almost the same efficiency. Again, this seems to confirm that the type of organization does not have significant affect to the efficiency performance of BBPJN and BPJN.

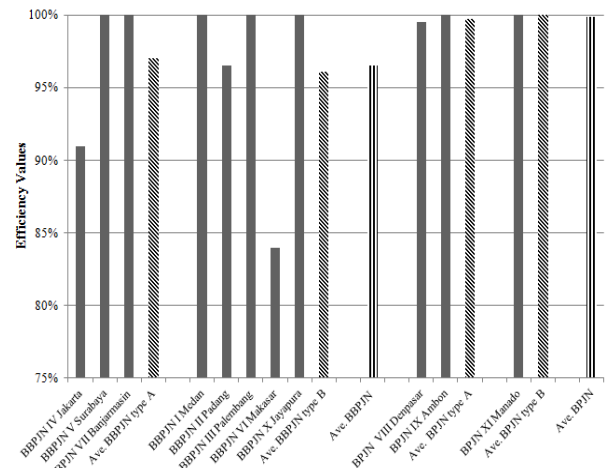


Figure 4. Efficiency scores of BPPJN and BPJN

5.2 Allocation and ratio of budget

With respect to allocated budget to each BBPJN or BPJN, DEA result did not seem to indicate any correlation between the sizes of budget to the efficiency values. This was shown, for example, by the performance of BBPJN V Surabaya and BBPJN VII Banjarmasin, each with more than Rp. 2 trillion budget, that have the same efficiency values of 100% as to what BPJN IX Ambon and BPJN XI Manado, which have less than Rp. 1 trillion in their 2011 budget. Therefore, it can be concluded that the magnitude of the budget allocation gives no significant impact on the level of efficiency of BBPJN or BPJN, and the greater budget does not guarantee higher performance.

One of the most important input factors in planning is the allocation of budget, as it was believed to be the most essential resources in an organization. Therefore, it is important to know whether budget will affect the performance. As shown in **Figure 5**, however, the results suggested that there was no correlation between

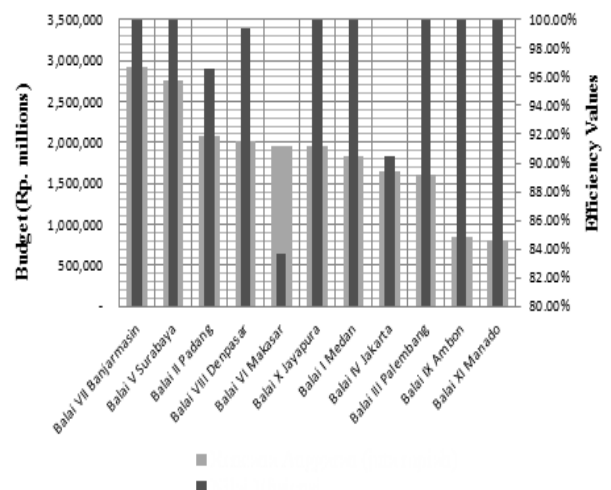


Figure 5. Budget vs. efficiency scores

the amounts of budget to the efficiency performance. Further, budget realization seemed to have similar tendency, as it showed no correlation between budget realization and the efficiency performance (**Figure 6**). Ratio of budget realization is calculated by dividing the realization of absorption of budget by planned budget. These two suggests that budget should not be used as the only indicator for measuring efficiency performance of BBPJN or BPJN.

5.3 Ratio of roadwork realization

Judging from the ratio of the realization of the work, no correlation was also found between the efficiency of the BBPJN/BPJN and the ratio of actual improvement or maintenance national roadwork.

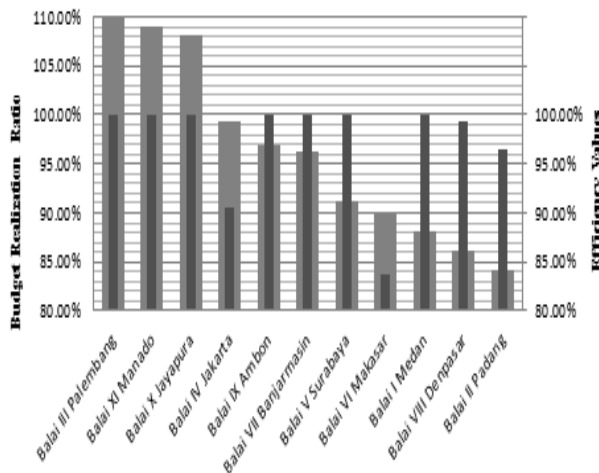


Figure 6. Budget realizations vs. efficiency scores

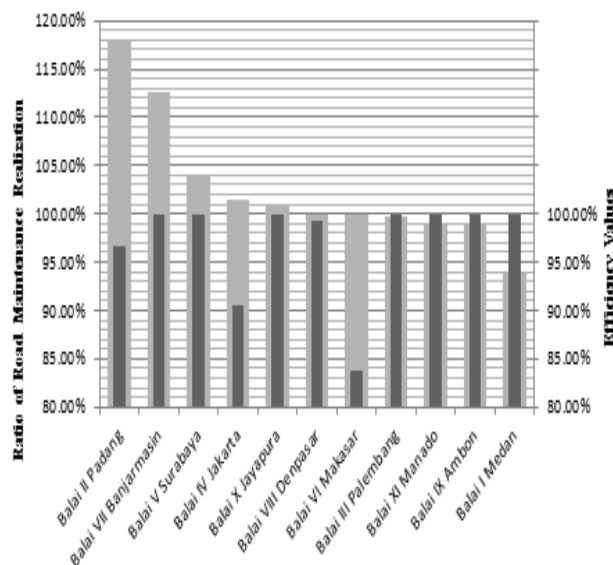


Figure 7. Ratio of road maintenance realization vs. efficiency values

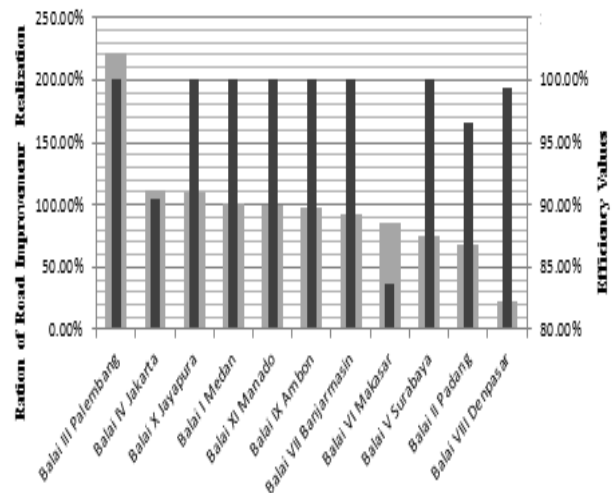
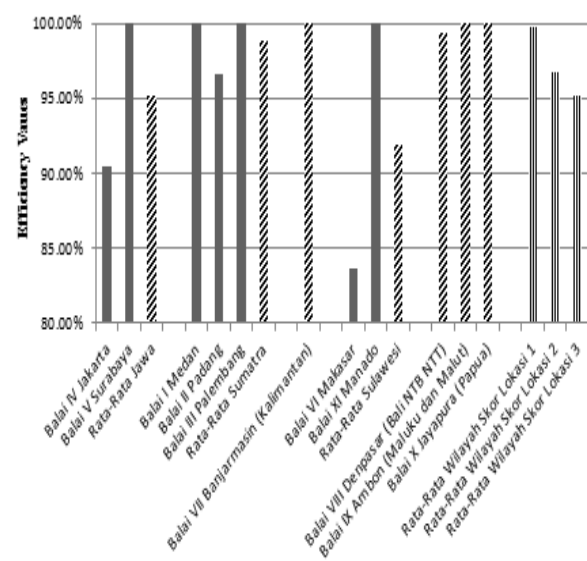


Figure 8. Ratio of road improvement realization vs. efficiency values

5.4 Location factors

Geographic location of BBPJN/BPJN will definitely affect the working capacity and workloads. In this study, 11 DMUs were studied and grouped into 7 regions: region-1 Sumatera island (Balai Besar I Medan, Balai Besar II Padang, and Balai Besar III Palembang), region-2 Jawa island (Balai Besar IV Jakarta and Balai Besar V Surabaya), region-3 Bali, West Nusa Tenggara, and East Nusa Tenggara (BPJN VIII Denpasar), region-4 Kalimantan (Balai Besar VII Banjarmasin), region-5 Sulawesi (BBPJN VI Makassar and BPJN XI Manado), region-6 Maluku and North Maluku islands (BPJN IX Ambon), and region-7 Papua (BBPJN X Jayapura).



▨ average based on location

▨ average based on location factor

Figure 9. Overall efficiency values

Based on the location factor listed in **Figure 2**, area in Jawa Island was rated with score 3 as location with the least difficult condition, whereas Bali, NTB, NTT, North Maluku, Maluku islands, and Papua were rated with score 1 reflecting the most difficult locations. The other BBPJN and BPJN were scored 2.

The above figure shows that on average BBPJN/BPJN located in islands of Kalimantan, Papua, Maluku and North Maluku got the highest efficiency scores, followed by Bali, West Nusa Tenggara NTB and East Nusa Tenggara, as well as Sumatera, and Sulawesi. Based on location factor, area with high degree of difficulty attained the highest efficiency values (99.97%), followed by area with moderate degree of difficulty (96.71%), and low degree of difficulty (95.25%), even tough with only very slim difference.

At this point, it can be concluded that, in general, BBPJNs in region with low difficulty condition were less efficient in using their resources in comparison to other BBPJNs and BPJNs in more difficult locations.

The reason for such a lower performance may lie on the complexity of problems faced by BBPJN in that region, which is probably not found in other regions, such as complexity of road networks, local government regulations, etc. However, this study was not intended to finding those reasons but merely to show that subjective judgment on the working condition should be taken into consideration. Therefore, it is necessary study the effect of subjective judgement on assigning the rate of difficulty of each location to the estimating accuracy of efficiency performance.

In accordance to Ministry of Public Works Law no 8 - 2010, this 7 regions was then consolidated into 3 larger regions, and for each of these three regions (region I - Sumatera, region II – Jawa, Bali, West Nusa Tenggara, East Nusa Tenggara, and Kalimantan, and region III - Sulawesi, Maluku, North Maluku, and Papua) the efficiency performance can be calculated.

As shown in **Figure 10**, region III has more DMUs (3 out of 4 DMUs) with the highest efficiency values than other regions. However, if examined more closely, although only slightly, the average efficiency values of region I was the highest, followed by region II and region III.

5.5 Sensitivity analysis

Each input or output factor has its own influencing strength over the efficiency values. The strength of influence needs to be known to determine whether such factors have significant impact or not against processes or activities executed within BBPJN/BPJN. If proven to be significant, such factor should become one of the main focuses of decision makers in improving the

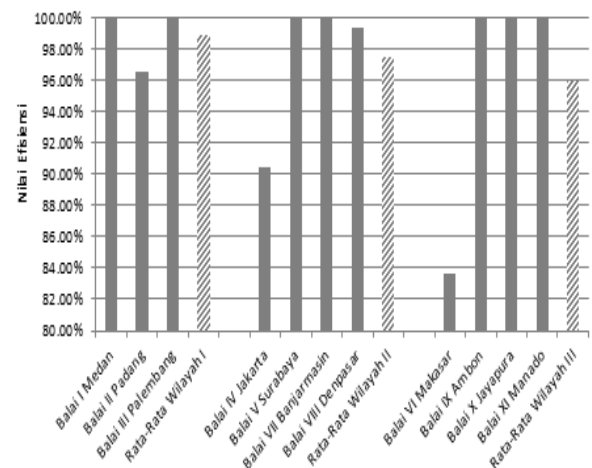


Figure 10. Efficiency values based on region

performance of BBPJN or BPJN. With the same output/input ratio, the decision maker can increase the values of input factor in order to get better output. In contrast, if such factors had only insignificant impact, they can be written off from the model.

In this study sensitivity analysis was carried out by methodically eliminating a range of output/input factors to determine their individual impact strength. After eliminating one factor, the efficiency value of the new output/input set was recalculated and the results were compared with the previous values. Ratio of efficiency change was calculated by dividing efficiency value after elimination of factor with the initial value, before the elimination. For example, to determine the effect of budget on the efficiency value, the efficiency values were calculated with and without the budget as input factors, followed by calculating the ration of those two efficiency values. This procedure was repeated for other factors.

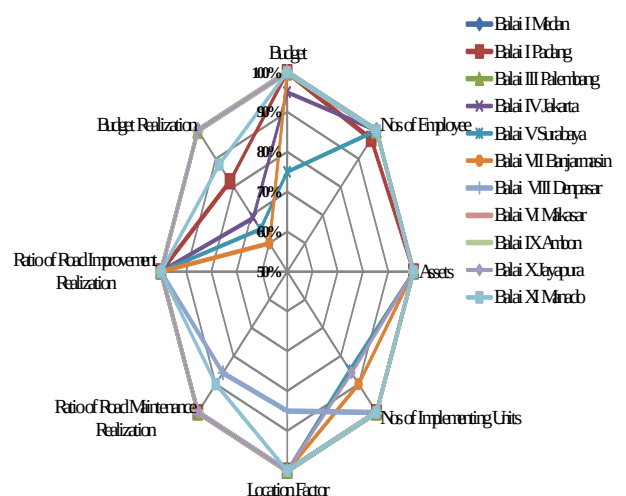


Figure 11. Ratio efficiency changes

The spider web diagram on **Figure 11** shows the ratio of changes for each input-output factor. The lower the percentage, the greater the changes and the more significant the factors in affecting the efficiency values of BBPJNs/BPJNs.

On average of all 11 DMUs, number of working units (input factor) and budget realization (output factor) has significant impact to the efficiency score. This means that number sub-unit and the ability to absorb budget have a very strong influence in BBPJN or BPJN efficiency performance. On the other side, input factors such as number of staffs and values of asset, and out factor of road improvement realization ratio did not seem to have any influence at all on BBPJN/BPJN's efficiency performance. The rest of the factors seem to have some influence on efficiency value, although it is not significant.

The lack of effect of the number of staff and the value of assets on the performance of BBPJNs and BPJNs is an interesting situation. Theoretically, the two input factors should have a significant impact on performance, and this situation must be wisely examined. Similar attention should be given to out factor of road improvement realization ratio, since one of the main objective of BBPJN and BPJN is improve the quality of road network within their respective region.

6. Conclusion

This paper has pointed out the limitation of the currently applied performance measurement model and shown the potential of DEA model to overcome such shortcomings.

1. LAKIP can only measure the performance of a unit from its effectiveness, or from the level of attainment that particular unit was able to accomplish with respect to a given target. Yet, at the same time, this model cannot be used to measure how good the unit is using resources to achieve the target. In relation to the performance measurement of BBPJN/BPJN, LAKIP does not consider the various conditions and characteristics of the units, so that workloads, service capacity and other factors are treated equally for all BBPJNs/BPJNs.
2. In contrast, DEA model can be utilized to help the management of Directorate General of Bina Marga in decision making process that related to the performance of individual BBPJN/BPJN. DEA model can be used to evaluate BBPJNs/BPJNs simultaneously, directly comparing each DMU against various aspects at once, and using the best performance BBPJN or BPJN as benchmarking points for future improvement. BBPJN or BPJN with good performance should be rewarded, whereas those with low performance should be improved

using the practices of the best performer as point of reference.

3. However, this method does have some limitations; in a sense it cannot provide apparent rationale on why one DMU is performing better than the others. Thus, decision maker should not rely fully to this model, but can still utilize it as a mean to indicate any discrepancies in performance amongst BBPJN/BPJN, as it certainly needs additional analysis to further determine the true input-output factor relationships.

7. Recommendation

Data used in this study is very limited, and was based only on 2011 data collected from Directorate General Bina Marga. Such a limitation may cause some inaccuracies, including the absence of roles of number of staffs and value of asset in influencing BBPJN/BPJN performances. The use of single year data, instead of from a series of annual reports, also contributed to the lack of information about the dynamics of performance efficiency BBPJN/BPJN, so any changes that may occur during the functioning period of BBPJN/BPJN can not be assessed accurately. This condition certainly will affect the follow up analysis, particularly on the strength of influences of input-output factors in sensitivity analysis.

Furthermore, in this study the value of location factor was highly subjective, unilaterally determined and not based on in-depth research related to the influence of geographical characteristics, accurate conditions of soil and area, quality of human resources, mobilization of resources and other technical and managerial factors. Therefore, it is recommended for further study to alleviate this subjective judgment approach with a more comprehensive and accurate data.

In measuring the performance of BBPJN and BPJN, DEA model can be used as alternative or complement to LAKIP. While it is understood that DEA model will not be able to reflect the absolute performance of the unit, its relative efficiency values can be used as benchmarking mechanism for overall evaluation of all BBPJN and BPJN, and becomes part of continuous improvement effort of the Directorate General Bina Marga.

For future study the application of DEA model can also be expanded to accommodate various assessment needs, by adding or subtracting input/output factors as necessary.

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