ANALYSIS OF THE EFFICIENCY OF COMPANIES IN SERBIA BASED ON THE DEA SUPER-RADIAL APPROACH

DOI: 10.5937/JEMC2301021L

UDC: 005.336.1 Original Scientific Paper

Radojko LUKIĆ¹

¹University of Belgrade, Faculty of Economics, 11000 Belgrade, Kamenička 6, Republic of Serbia ORCID ID (<u>https://orcid.org/0000-0001-6529-0297</u>) Corresponding author. E-mail: <u>radojko.lukic@ekof.bg.ac.rs</u>

Paper received: 15.01.2023.; Paper accepted: 24.04.2023.

The issue of analyzing the company's efficiency factors is very challenging, current, significant, and complex. Based on that, this paper analyzes the efficiency of companies in Serbia based on the DEA Super-Radial approach. According to the results of the Super-Radial (Super-CCR-I and Super-CCR-O) model in 2021, none of the analyzed companies in Serbia was efficient. This means that the input/output elements were poorly managed. According to the results of the Super-Radial (Super-BCC-I) model in the same year in Serbia, two companies were efficient. These are JP EPS and NIS. Other observed companies were inefficient. According to the results of the Super-Radial (Super-BCC-O) model in 2021, three companies in Serbia were efficient. They are MERCATA VT, MY KIOSK GROUP, and KNEZ PETROL COMPANY. Other observed companies were inefficient. According to the projection, to achieve the planned efficiency, for example, at the DMU unit of JP EPS in 2021, it was necessary to reduce the number of employees by 51.93%, business assets by 57.18%, capital by 56.34%, business income by 3.00% and increase the net profit by 235.28 %. According to Slack analysis, for example, in the DMU unit of JP EPS, to increase efficiency, it is necessary to reduce the number of employees by 12469, business assets by 548953, capital by 339215 and increase the net profit by 35984.19 monetary units. The efficiency of companies in Serbia was influenced by numerous macro and micro factors: the economic climate, the efficiency of management of human resources, assets, capital, sales, and profit, etc. Their adequate control can significantly influence the achievement of the company's target profit in Serbia.

Keywords: Efficiency; Companies; Serbia; DEA Super-Radial model.

INTRODUCTION

It is a very challenging problem to evaluate the efficiency of companies based on the DEA model (Alam et al., 2022; Amirteimoori et al., 2022; Fotova Čiković & Lozić, 2022; Park, & Kim, 2022; Sala-Garrido, 2023; Zohreh Moghaddas et al., 2022). In this paper, the financial efficiency of companies in Serbia is investigated using the DEA Supe-Radila model. The goal and purpose of this are to see as fully as possible the efficiency of companies in Serbia in the function of improvement in the future by applying relevant measures, and in this, among other things, the scientific and professional contribution of this work is reflected.

In the world, the literature dedicated to the development and application of the DEA model in

economics is very rich (Amini et al., 2019; Andersen, & Petersen, 1993; Banker et al., 1984; Chang et al., 2020; Chen et al., 2021; Fenyves, & Tarnóczi, 2020; Guo, & Cai, 2020;

Lee et al., 2011; Lin et al., 2020; Mandić et al., 2017; Pendharkar et al., 2021; Podinovski et al., 2021; Rostamzadeh et al., 2021; Tone, 2002; Tsai et al., 2021). This is also the case with literature in Serbia (Lukic & Hadrovic Zekic, 2019; Lukic & Kozarevic, 2019; Lukic et al., 2017, 2020; Lukic, 2018, 2021, 2022a,b, 2023a,b,c,d,e; Vojteški Kljenak & Lukić, 2022). All this literature serves as a theoretical-methodological and empirical basis for finding the super financial efficiency of companies in Serbia based on the DEA Super-Radial model.

ISSN 2217-8147 (Online) ©2023 University of Novi Sad, Technical faculty "Mihajlo Pupin" in Zrenjanin, Republic of Serbia Available online at <u>http://www.tfzr.uns.ac.rs/jemc</u>

Continuous monitoring of the company's efficiency, in the specific case of Serbia, is a basic assumption for improvement in the future by applying relevant measures. This reflects the primary research hypothesis in this paper. The research methodology of the given hypothesis is based on the application of the DEA Super-Radial model. In principle, DEA models concerning ratio analysis provide more realistic information about the financial efficiency of companies. Because it uses several input/output elements integrated. The application of the DEA Super-Radial model has a significant role in understanding the real situation regarding the efficiency of companies in Serbia. Their application clearly indicates which companies are efficient and which are not, and which measures should be taken in order to transform inefficient into efficient companies in Serbia (Amin, & Hajjami, 2021; Chen et al., 2018, 2020, 2021a,b; Cooper et al., 1999; Đurić et al., 2020; Lukić 2022a,b,c; Martić, & Savić, 2001; Radonjić, 2020; Rasoulzadeh et al., 2021; Stević et al., 2022; Stojanović et al., 2022).

The necessary empirical data for the research of the treated problem in this paper were collected from the Agency for Economic Registers of the Republic of Serbia. The data is "produced" following relevant international standards. This facilitates and enables an international comparison of the results obtained in this paper.

METHODOLOGY

In this paper, the financial efficiency of companies in Serbia is investigated using the DEA Super-Radial model. Suppose we have *n* DMUs {DMU $_j$ (j = 1,2,..., n)}. Each consumes a set of *m* inputs, *x* $_{ij}$ (i = 1,2,..., m), in the production of a set of *s* outputs, Y_{rj} (r = 1,..., s). Based on VRS (variable return to scale) model (Banker et al., 1984), the input-oriented VRS super-efficient efficiency measurement model can be expressed as:

$$\min \quad \theta \\ s.t \sum_{j=1}^{n} \lambda_j x_{ij} \le \theta x_{ik}, \quad i = 1, ..., m \\ j \ne k \\ \sum_{j=1}^{n} \lambda_j y_{rj} \ge y_{rk}, \quad r = 1, ..., s \qquad (1) \\ j \ne k$$

$$\sum_{j=1}^{n} \lambda_j = 1$$
$$j \neq k$$
$$\lambda \ge 0, \quad j \neq k$$

RESULTS AND DISCUSSION

When analyzing the efficiency of companies in Serbia based on the DEA Super-Radial model of input and output orientation, with constant and variable returns, the following elements were used as input elements: a number of employees, business assets and capital, and as output elements: business income and net profit / net loss. The selected input/ output data fully show the financial efficiency of companies. That is why they are used when analyzing the super financial efficiency of the most important companies in Serbia. DMU units are considered the largest companies in Serbia according to business income that operated in 2021. Table 1 shows the input/output elements for 2021.

The input/output data statistics show a high correlation between the given variables. In further presentations of the treated issues in this paper, we will present the results of the DEA Super-Radial model. (All calculations and results in this paper are the author's own.) Table 2 shows the results of the Super-Radial (Super-CCR-I and Super-CCR-O) model.

The company is super-efficient if the score is equal to 1. In the case of inefficient companies, the score is different from 1.

According to the results of the Super-Radial (Super-CCR-I and Super-CCR-O) model, none of the analyzed companies in Serbia was efficient in 2021. Their scores are different from 1. This means that the input/output elements were poorly managed. The target efficiency of companies in Serbia can be achieved by their adequate control... An important role in this is the application of modern concepts of cost management, sales revenue, profit, and customers. Digitization of the entire business is also one of the critical factors for the business success of modern companies. Table 3 shows the results of the Super-Radial (Super-BCC-I and Super-BCC-O) model.

| | | raote n.mp | ui, ouipui aa | 101 | | |
|--|---|----------------------------|------------------------|-------------|---------------------|------------------------------|
| DMU | Sector | (I) Number of employees | (I) Business assets | (I) Capital | (O) Business income | (O) Net profit / Net loss |
| JP EPS BELGRADE | D-supply of electricity, gas, steam, and air conditioning | 24.013 | 959.978.120 | 602.051.809 | 319.834.327 | - 15.492.467 |
| NIS AD NOVI SAD | B-mining | 11.544 | 411.025.157 | 262.836.211 | 310.238.277 | 20.957.03 |
| TELEKOM SRBIJA AD, BELGRADE | J-information and communications | 12.333 | 490.964.452 | 185.581.329 | 144.701.134 | 6.709.246 |
| JP SRBIJAGAS NOVI SAD | D-supply of electricity, gas, steam, and air conditioning | 2.471 | 287.578.349 | 129.753.548 | 122.489.585 | 5.802.970 |
| DELHAIZE S | G-wholesale and retail trade; repair of motor vehicles and motorcycles | 11.637 | 83.293.447 | 42.881.583 | 118.912.715 | 2.989.461 |
| NELT CO. DOO BELGRADE | G-wholesale and retail trade; repair of motor vehicles and motorcycles | 3.121 | 37.637.630 | 18.721.522 | 87.126.267 | 248.331 |
| DELTA HOLDING DOO BELGRADE | M-professional, scientific, innovative, and technical activities | 3.311 | 149.188.208 | 83.718.203 | 76.424.081 | 2.497.651 |
| MERCATA VT DOO | G-wholesale and retail trade; repair of motor vehicles and motorcycles | 1.078 | 12.763.274 | 1.093.035 | 75.391.561 | 958.452 |
| PHOENIX PHARMA DOO BELGRADE | G-wholesale and retail trade; repair of motor vehicles and motorcycles | 2.749 | 39.024.302 | 10.837.865 | 74.941.130 | 1.772.275 |
| COCA-COLA HBC - SERBIA DOO ZEMUN | C-processing industry | 1.623 | 56.832.256 | 43.084.091 | 64.769.803 | 6.783.008 |
| MY KIOSK GROUP DOO | K-financial activities and insurance activities | 3.589 | 12.247.043 | 2.622.462 | 64.365.537 | 596.487 |
| TARKETT DOO BACA PALANKA | C-processing industry | 3.215 | 38.174.721 | 19.813.533 | 58.565.776 | 2.493.835 |
| MK GROUP DOO BELGRADE | K-financial activities and insurance activities | 2.151 | 94.429.880 | 46.830.681 | 57.675.525 | 17.461.388 |
| KNEZ PETROL COMPANY DOO BELGRADE | M-professional, scientific, innovative, and technical activities | 1.183 | 11.849.900 | 3.417.319 | 52.652.064 | 3.447.603 |
| HEMOFARM AD VRŠAC | C-processing industry | 3.922 | 68.380.107 | 47.524.813 | 49.284.002 | 5.091.653 |
| MILŠPED DOO BELGRADE | H-transport and storage | 2.758 | 27.749.201 | 3.547.447 | 45.553.539 | 1.084.644 |
| FCA SERBIA DOO KRAGUJEVAC | C-processing industry | 2.072 | 49.521.815 | 31.195.733 | 41.512.762 | - 3.866.438 |
| EMSAD BELGRADE | D-supply of electricity, gas, steam, and air conditioning | 1.656 | 105.336.795 | 69.530.738 | 39.043.259 | 2.362.403 |
| KOEFIK DOO BELGRADE | G-wholesale and retail trade; repair of motor vehicles and motorcycles | 2.983 | 34.703.094 | 8.502.607 | 38.062.233 | 152.317 |
| YURA CORPORATION DOO RACA | C-processing industry | 6.913 | 27.713.854 | 4.458.143 | 37.188.438 | - 1.092.021 |

Table 1: Input / Output data

Note: Data are expressed in thousands of dinars. The number of employees is expressed in whole numbers *Source*: Annual report on the operations of economic units in the economy in 2021. Serbian Business Registers Agency

| | | Super-Radial(Super-CCR-I) Returns to Scale = Constant | | Super-Radial(Super-CCR-O) Returns to Scale = Constant | |
|-----|---------------------------------|--|------|--|------|
| | | (0 = Sum of Lambda < Infinity) | | (0 = Sum of Lambda < Infinity) | |
| No. | DMU | Score | Rank | Score | Rank |
| 1 | JP EPS | 6.12E-02 | 20 | 6.12E-02 | 20 |
| 2 | NIS | 0.31115 | 11 | 0.31115 | 11 |
| 3 | TELEKOM SERBIA | 9.46E-02 | 19 | 0.094582 | 19 |
| 4 | JP SRBIJAGAS | 0.20389 | 14 | 0.20389 | 14 |
| 5 | DELHAIZE S | 0.260436 | 12 | 0.260436 | 12 |
| 6 | NELT CO. | 0.392684 | 6 | 0.392684 | 6 |
| 7 | DELTA HOLDING | 0.13402 | 18 | 0.13402 | 18 |
| 8 | MERCATA VT | 2.912059 | 2 | 2.912059 | 2 |
| 9 | PHOENIX PHARMA | 0.35726 | 7 | 0.35726 | 7 |
| 10 | COCA-COLA HBC - SERBIA | 0.669829 | 5 | 0.669829 | 5 |
| 11 | MY KIOSK GROUP | 256.434 | 1 | 256.434 | 1 |
| 12 | TARKETT | 0.312934 | 10 | 0.312934 | 10 |
| 13 | MK GROUP | 1.772034 | 4 | 1.772034 | 4 |
| 14 | KNEZ PETROL COMPANY | 2.249153 | 3 | 2.249153 | 3 |
| 15 | HEMOPHARM | 0.320259 | 9 | 0.320259 | 9 |
| 16 | MILŠPED | 0.322236 | 8 | 0.322236 | 8 |
| 17 | FCA SERBIA | 0.150305 | 17 | 0.150305 | 17 |
| 18 | EMSAD | 0.16225 | 16 | 0.16225 | 16 |
| 19 | COEFFICIENT | 0.185677 | 15 | 0.185677 | 15 |
| 20 | YURA CORPORATION | 0.227171 | 13 | 0.227171 | 13 |
| | Average | 13.37665 | | 13.37665 | |
| | SD | 55.76638 | | 55.76638 | |
| | Maximum | 256.434 | | 256.434 | |
| | The minimum | 0.061167 | | 0.061167 | |
| | No. of efficient DMUs = | 0 | | 0 | |
| | No. of inefficient DMUs = | 20 | | 20 | |
| | No. of over-iteration DMUs = | 0 | | 0 | |

Table 2: Super-Radial (Super-CCR-I and Super-CCR-O) model results

The results of the DEA Super-Radial model can be presented graphically. This is shown by the illustration of the results of the Super BCC-O model in Figure 1. In Figure 1, efficient companies in Serbia are marked with a score 1. The graphic illustration provides a visual insight into the super financial efficiency of the observed companies in Serbia.

In Table 3, efficient companies in Serbia are marked with a score of 1. According to the results of the Super-Radial (Super-BCC-I) model in 2021 in Serbia, two companies were efficient. These are JP EPS and NIS. Other observed companies were inefficient. According to the results of the Super-Radial (Super-BCC-O) model in 2021 in Serbia, three companies were efficient. They are MERCATA VT, MY KIOSK GROUP, and KNEZ PETROL COMPANY. Other observed companies were inefficient. In order to improve the super financial efficiency of companies in Serbia, especially inefficient ones, it is therefore necessary, among other things, to manage the observed input/output elements as efficiently as possible.

The projection of input/output elements shows the deviation of the realized from the planned values of input/output elements. It represents a significant basis for improving the efficiency of the observed DMU units by applying relevant measures. In the specific case, therefore, in order to achieve the planned efficiency in 2021, for example at the DMU unit of JP EPS, it was necessary to reduce the number of employees by 51.93%, business assets by 57.18%, capital by 56.34%, business income by 3.00% and increase the net profit by 235.28%. The projection analysis is similar to the other observed DMU units.

| | Super-Radial(Super-BCC-I) | | | Super-Radial(Super-BCC-O) | |
|-----|---------------------------------|------------------------------------|------|------------------------------------|------|
| | | Returns to Scale = Variable | | Returns to Scale = Variable | |
| | | (Sum of Lambda = 1) | | (Sum of Lambda = 1) | |
| No. | DMU | Score | Rank | Score | Rank |
| 1 | JP EPS | 1 | 7 | 1.030931 | 5 |
| 2 | NIS | 1 | 7 | 2.412435 | 2 |
| 3 | TELEKOM SERBIA | 0.418785 | 14 | 0.595383 | 15 |
| 4 | JP SRBIJAGAS | 1.12797 | 6 | 1.065611 | 3 |
| 5 | DELHAIZE S | 1.156649 | 5 | 1.053391 | 4 |
| 6 | NELT CO. | 0.857021 | 9 | 0.964137 | 9 |
| 7 | DELTA HOLDING | 0.233777 | 19 | 0.564693 | 16 |
| 8 | MERCATA VT | 9.786444 | 2 | 1 | 6 |
| 9 | PHOENIX PHARMA | 0.442959 | 13 | 0.902179 | 10 |
| 10 | COCA-COLA HBC - SERBIA | 0.722427 | 10 | 0.870649 | 11 |
| 11 | MY KIOSK GROUP | 300.3592 | 1 | 1 | 6 |
| 12 | TARKETT | 0.316245 | 17 | 0.702323 | 12 |
| 13 | MK GROUP | 4.455145 | 3 | 2.485687 | 1 |
| 14 | KNEZ PETROL COMPANY | 2.338631 | 4 | 1 | 6 |
| 15 | HEMOPHARM | 0.322785 | 16 | 0.595775 | 14 |
| 16 | MILŠPED | 0.452674 | 11 | 0.609504 | 13 |
| 17 | FCA SERBIA | 0.243888 | 18 | 0.427638 | 19 |
| 18 | EMSAD | 0.185012 | 20 | 0.420793 | 20 |
| 19 | COEFFICIENT | 0.346999 | 15 | 0.457986 | 18 |
| 20 | YURA CORPORATION | 0.447723 | 12 | 0.471357 | 17 |
| | Average | 16.31072 | | 0.931524 | |
| | SD | 65.20087 | | 0.553994 | |
| | Maximum | 300.3592 | | 2.485687 | |
| | The minimum | 0.185012 | | 0.420793 | |
| | No. of efficient DMUs = | 2 | | 3 | |
| | No. of inefficient DMUs = | 18 | | 17 | |
| | No. of over-iteration DMUs = | 0 | | 0 | |

| Table 3: Super-Radial | (Super-BCC-I and Super | r-BCC-O) model results |
|--|------------------------|------------------------|
| ······································ | | |

The slack analysis is very important. It shows what measures should be taken to transform an inefficient DMU unit into an efficient one (Zhu, & He, 2023). So, for example, at the DMU unit of JP EPS, to increase efficiency, it is necessary to reduce the number of employees by 12469, business assets by 548953, capital by 339215, and increase the net profit by 35984.19 monetary units. The Slack analysis is similar to the other observed DMU units. Determinants of the efficiency of companies in Serbia are macro and micro in nature. In addition to the economic climate, inflation, interest, exchange rate, foreign direct investments, and competition, the efficiency of companies in Serbia is significantly affected by the adequate management of human capital, assets, capital, sales, and profit. Adequate control of these and other factors can achieve the target efficiency of companies in Serbia.

In the literature in Serbia, as far as we know, there is no continuous analysis of the efficiency of companies in Serbia based on the DEA Super– Radial approach. In order to improve the efficiency of companies in Serbia, it is recommended to continuously perform data analysis using different DEA models. It provides a basis for the selection of relevant measures for these purposes.

In order to get a more complete overview of the financial efficiency of companies in Serbia, it is recommended that in addition to the ratio analysis, DEA analysis, and multi-criteria decision-making models are used (TOPSIS, VIKOR, MARCOS, and others).



Figure 1: Super-Radial (Super-BCC-O)

CONCLUSION

We are able to conclude the following based on the conducted empirical research on the problem treated in this paper:

- According to the results of the Super-Radial (Super-CCR-I and Super-CCR-O) model in 2021, none of the analyzed companies in 2021 in Serbia was efficient, among other things due to poor management of input/output elements.
- According to the results of the Super-Radial (Super-BCC-I) model in 2021 in Serbia, two companies were efficient. These are JP EPS and NIS. Other observed companies were inefficient.
- According to the results of the Super-Radial (Super-BCC-O) model in 2021 in Serbia, three companies were efficient. They are MERCATA VT, MY KIOSK GROUP, and

KNEZ PETROL COMPANY. Other observed companies were inefficient.

- In the specific case, according to the projection, in order to achieve the planned efficiency in 2021, for example, the DMU unit of JP EPS, it was necessary to reduce the number of employees by 51.93%, business assets by 57.18%, capital by 56.34%, business income by 3.00% and increase the net profit by 235.28%.
- According to the Slack analysis, for example, in order to increase the efficiency of the DMU unit of JP EPS, it is necessary to reduce the number of employees by 12469, business assets by 548953, capital by 339215, and increase the net profit by 35984.19 monetary units.

It is recommended to organize effective control of critical factors of business success (asset

management, capital, sales, profit, and human resources) and others in order to achieve the target efficiency of companies in Serbia.

REFERENCES

- Alam, T.E., González, A.D., & Raman, S. (2022). Benchmarking of academic departments using data envelopment analysis (DEA). *Journal of Applied Research in Higher Education*, Vol. ahead-of-print No. ahead-of-print., 1-30.
- https://doi.org/10.1108/JARHE-03-2021-0087 Amini, A., Alinezhad, A., & Yazdipoor, F. (2019). A TOPSIS, VIKOR and DEA integrated evaluation method with belief structure under uncertainty to rank alternatives. *International Journal of Advanced Operations Management*, *11*(3), 171–188. https://doi.org/10.1504/IJAOM.2019.100708
- Amin, G. R., & Hajjami, M. (2021). Improving DEA cross-efficiency optimization in portfolio selection. *Expert Systems with Applications*, 168, 114280. https://doi.org/10.1016/j.eswa.2020.114280
- Amirteimoori, A., Mehdizadeh, S., & Kordrostami, S., (2022). Stochastic performance measurement in two-stage network processes: A data envelopment analysis approach. *Kybernetika*, 58(2), 200-217. https://doi.org/10.14736/kyb-2022-2-0200
- Andersen, P., & Petersen, N.C. (1993). A procedure for ranking efficient units in data envelopment analysis. *Management Science*, 39, 1261-1264. https://doi.org/10.1287/mnsc.39.10.1261
- Banker, R.D., A. Charnes, A., & Cooper, W.W. (1984). Some models for estimating technical and scale inefficiencies in data envelopment analysis. *Management Science*, 30(9), 1078–1092. https://doi.org/10.1287/mnsc.30.9.1078
- Chang, X., & Wang, X. (2020). Research Performance Evaluation of University Based on Super DEA Model. 2020 IEEE 9th Joint International Information Technology and Artificial Intelligence Conference (ITAIC), 1252-1255. https://doi.org/10.1109/ITAIC49862.2020.9339131
- Chen, W., Gai, Y., & Gupta, P. (2018). Efficiency evaluation of fuzzy portfolio in different risk measures via DEA. Annals of Operations Research, 269(1), 103-127. https://doi.org/10.1007/s10479-017-2411-9
- Chen, W., Li, S. S., Zhang, J., & Mehlawat, M. K. (2020). A comprehensive model for fuzzy multiobjective portfolio selection based on DEA crossefficiency model. *Soft Computing*, *24*(4), 2515-2526. https://doi.org/10.1007/s00500-018-3595-x
- Chen, W., Li, S. S., Mehlawat, M. K., Jia, L., & Kumar, A. (2021a). Portfolio Selection Using Data Envelopment Analysis Cross-Efficiency Evaluation with Undesirable Fuzzy Inputs and Outputs. *International Journal of Fuzzy Systems*, 23(5), 1478-1509. https://doi.org/10.1007/s40815-020-01045-y

- Chen, C., Liu, H., Tang, L., & Ren, J. (2021b). A Range Adjusted Measure of Super-Efficiency in Integer-Valued Data Envelopment Analysis with Undesirable Outputs. *Journal of Systems Science and Information*, 9(4), 378-398. https://doi.org/10.21078/JSSI-2021-378-21
- Cooper, W. W., Park, K. S., & Pastor, J. T. (1999).
 RAM: a range adjusted measure of inefficiency for use with additive models, and relations to other models and measures in DEA. *Journal of Productivity analysis*, *11*(1), 542.
 https://doi.org/10.1023/A:1007701304281
- Đurić, Z., Jakšić, M. & Krstić, A. (2020). DEA window analysis of insurance sector efficiency in the Republic of Serbia. *Economic Themes*, 58(3),291-310. https://doi.org/10.2478/ethemes-2020-0017
- Fenyves, V., & Tarnóczi, T. (2020). Data envelopment analysis for measuring performance in a competitive market. *Problems and Perspectives in Management*, 18(1), 315-325.
- https://doi.org/10.21511/ppm.18(1).2020.27 Fotova Čiković, K., & Lozić, J. (2022). Application of Data Envelopment Analysis (DEA) in Information and Communication Technologies. *Tehnički glasnik*, *16*(1), 129-134. https://doi.org/10.31803/tg-20210906103816
- Guo, D., & Cai, Z.Q. (2020). Super-Efficiency Infeasibility in the Presence of Nonradial Measurement. *Mathematical Problems in Engineering*, 2020 Article ID 6264852, 7. https://doi.org/10.1155/2020/6264852
- Lee, H.S., Chu, C.W., & J. Zhu, J. (2011). Superefficiency DEA in the presence of infeasibility. *European Journal of Operational Research*, 212(1), 141–147. https://doi.org/10.1016/j.ejor.2011.01.022
- Lin, R. (2020). Cross-efficiency evaluation capable of dealing with negative data: A directional distance function based approach. *Journal of the Operational Research Society*, 71(3), 505-516. https://doi.org/10.1080/01605682.2019.1567652
- Lukic, R., Sokic, M., & Kljenak, D.V. (2017). Efficiency analysis of the banking sector in the Republic of Serbia. *Business Excellence and Management*, 7, 5–17.
- Lukic, R. (2018). Analysis of the efficiency of insurance companies. In: Insurance in the post-crisis era, Belgrade: Faculty of Economics, University of Belgrade. ISBN: 978-86-403-1548-7.
- Lukic, R., & Hadrovic Zekic, B. (2019). Evaluation of efficiency of trade companies in Serbia using the DEA approach. Proceedings of the 19th International Scientific Conference Business Logistics In Modern Management October 10-11, Osijek, Croatia, Josip Juraj Strossmayer University of Osijek, Faculty of Economics in Osijek, 145-165.
- Lukić, R., & Kozarević, E. (2019). Analysis of selected countries trade efficiency based on the DEA models. December 2019, *The Sixth Scientific Conference* with International Participation "Economy of Integration" ICEI 2019 - (E) Migrations And

Competitiveness Of South-Eastern European Countries. At: Tuzla, Bosnia and Herzegovina, 61-71.

Lukić, R., Hanić, H., & Bugarčić, M. (2020). Analysis of profitability and efficiency of trade in Serbia. *Economic Analusis*, 53(2), 39-50.

Lukić, R. (2021). Evaluation of the efficiency of public companies in Serbia using the ARAS method. 21st International Scientific Conference Business Logistics in Modern Management, October 7-8, Osijek Croatia, 43-53.

Lukic, R. (2022a) Analysis of efficiency factors of companies in Serbia based on artificial neural networks. Анали Економског факултета у Суботици – The Annals of the Faculty of Economics in Subotica, 58(47), 097-115. https://doi.org/10.5937/AnEkSub2247097L

Lukic, R. (2022b). Evaluation of financial performance and efficiency of companies in Serbia. *Journal of engineering management and competitiveness* (*JEMC*), 12(2), 132-141. https://doi.org/10.5937/JEMC2202132L

Lukic, R.(2022c). Measurement and Analysis of the Dynamics of Financial Performance and Efficiency of Trade in Serbia Based on the DEA Super-Radial Model. *Review of International Comparative Management*, 23(5), 630-645. https://doi.org/10.24818/RMCI.2022.5.630

Lukić, R. (2023a). Measurement and Analysis of The Information Performance of Companies in The European Union and Serbia Based on The Fuzzy LMAW and MARCOS Methods. *Informatica Economica*, 27(1), 17 - 31.

https://doi.org/10.24818/issn14531305/27.1.2023.02

Lukić, R. (2023b). Analysis of the performance of the Serbian economy based on the MEREC-WASPAS method analysis of the performance of the Serbian economy based on the MEREC-WASPAS method. *MARSONIA: Časopis za društvena i humanistička istraživanja*, 2(2), 39-53.

Lukić, R. (2023c). Influence of Net Working Capital on Trade Profitability in Serbia. *European Journal of Interdisciplinary Studies*, 15(1), 48-67. DOI: http://doi.org/10.24818/ejis.2023.04

Lukić, R. (2023d). Analysis of the performance of companies in Serbia listed on the Belgrade stock exchange. Zbornik radova / Conference Proceedings, Računovodstvo i revizija u teoriji i praksi / Accounting and audit in theory and practice, Banja Luka College / Besjeda Banja Luka, 5(5),69-80. DOI 10.7251/ZRRRTP2301069L

Lukić, R. (2023e). Comparative analysis of transport and storage information systems of the European Union and Serbia using fuzzy LMAW and MARCOS methods. *Economy, Business & Development*, 4(1), 1-17DOI: 10.47063/ebd.00011

Mandić, K., Delibašić, B., Knežević, S. & Benković, S. (2017). Analysis of the efficiency of insurance

companies in Serbia using the fuzzy AHP and TOPSIS methods. *Economic Research*, *30*(1), 550-565.

https://doi.org/10.1080/1331677X.2017.1305786

Martić, M., & Savić, G. (2001). An application of DEA for comparative analysis and ranking of regions in Serbia with regards to social-economic development. *European Journal of Operational Research*, 132(2), 343-356. https://doi.org/10.1016/S0377- 2217(00)00156-9

Zohreh Moghaddas, Z., Oukil, A., & Vaez-Ghasemi, M. (2022). Global multi-period performance evaluation - new model and productivity index. *RAIRO-Operation Research*, *56*, 1503–1521. https://doi.org/10.1051/ro/2022065

Park, W., & Kim. S-G. (2022). Integrating quantitative and qualitative methodologies to build a national R&D plan using data envelopment analysis based on R&D stakeholders' perspectives. *PLoS ONE*, 17(3), e0265058.

https://doi.org/10.1371/journal.pone.0265058 Pendharkar, PC (2021). Hybrid radial basis function DEA and its applications to regression, segmentation and cluster analysis problems. *Machine Learning with Applications*, 6, 100092. https://doi.org/10.1016/j.mlwa.2021.100092.

Podinovski, V.V., & Bouzdine-Chameeva, T. (2021). Optimal solutions of multiplier DEA models. *J Prod Anal*, 56, 45–68. https://doi.org/10.1007/s11123-021-00610-3

Radonjić, Lj. (2020). Comparative Analysis of the Regional Efficiency in Serbia: DEA Approach Comparative Analysis of the Regional Efficiency in Serbia: DEA Approach. *Industrija*, 48(2), 1-19. https://doi.org/10.5937/industrija48-24343

Rasoulzadeh, M., Edalatpanah, S. A., Fallah, M., & Najafi, S. E. (2022). A multi-objective approach based on Markowitz and DEA cross-efficiency models for the intuitionistic fuzzy portfolio selection problem. *Decision Making: Applications in Management and Engineering*, 5(2), 241-259. https://doi.org/10.31181/dmame0324062022

Rostamzadeh, R., Akbarian, O., Banaitis, A., & Soltani,
Z. (2021). Application of DEA in benchmarking: a systematic literature review from 2003–2020. *Technological and Economic Development of Economy*, 27(1), 175-222.
https://doi.org/10.3846/tede.2021.13406

Sala-Garrido, R., Mocholí-Arce, M., Maziotis, A., & Molinos-Senante, M. (2023). Benchmarking theperformance of water companies for regulatory purposes to improve its sustainability. *Clean Water*, 6(1). https://doi.org/10.1038/s41545-022-00218-6

Stević, Ž., Miškić, S., Vojinović, D., Huskanović, E., Stanković, M., & Pamučar, D. (2022). Development of a Model for Evaluating the Efficiency of Transport Companies: PCA–DEA–MCDM Model. *Axioms*, 11, 140.

https://doi.org/10.3390/axioms11030140

Stojanović, I. ., Puška, A. ., & Selaković, M. (2022). A Multi-Criteria Approach To The Comparative Analysis Of The Global Innovation Index On The Example Of The Western Balkan Countries. *Economics - Innovative and Economics Research Journal*, *10*(2). https://doi.org/10.2478/eoik-2022-0019

R. Lukić

- Tone, K. (2002). A slacks-based measure of superefficiency in data envelopment analysis. *European Journal of Operational Research*, 143, 32-41.
- Tsai, C., Lee, H., & Gan, G. (2021). A New Fuzzy DEA Model for Solving the MCDM Problems in Supplier Selection. *Journal of Marine Science and*

Technology, 29(1), 7. https://doi.org/10.51400/2709-6998.1006

- Vojteški, K., D., & Lukić, R. (2022). Evaluation of the efficiency of providers of financial leasing in Serbia. *Glasnik društvenih nauka - Journal of Social Sciences*, 14(14), 113-144.
- Zhu, N., & He, K. (2023). The efficiency of major industrial enterprises in Sichuan province of China: a super slacks-based measure analysis. *Journal of Industrial and Management Optimization*, 19(2), 1328–1349. https://doi.org/10.3934/jimo.2021231

ANALIZA EFIKASNOSTI KOMPANIJA U SRBIJI NA BAZI DEA SUPER-RADIJALNOG PRISTUPA

Pitanje analize faktora efikasnosti kompanija je veoma izazovno, aktuelno, značajno i kompleksno. Na osnovu toga, ovaj rad analizira efikasnost kompanija u Srbiji na osnovu DEA Super-Radijalnog pristupa. Prema rezultatima Super-Radijalnog (Super-CCR-I i Super-CCR-O) modela u 2021. godini, nijedna od analiziranih kompanija u Srbiji nije bila efikasna. To znači da se ulazno/ izlaznim elementima loše upravlja. Prema rezultatima Super-Radijalnog (Super-BCC-I) modela, iste godine u Srbiji dve kompanije su bile efikasne. To su JP EPS i NIS. Ostale posmatrane kompanije bile su neefikasne. Prema rezultatima Super-Radijalnog (Super-BCC-O) modela u 2021. tri kompanije u Srbiji bile su efikasne. To su MERCATA VT, MOJA KIOSK GRUPA i KNEZ PETROL COMPANI. Ostale posmatrane kompanije bile su neefikasne. Prema projekciji, da bi se postigla planirana efikasnost, na primer, u jedinici DMU JP EPS u 2021. godini bilo je potrebno smanjiti broj zaposlenih za 51,93%, poslovnu imovinu za 57,18%, kapital za 56,34%, poslovni prihod za 3,00% i povećanje neto dobiti za 235,28%. Prema Slack analizi, na primer, u DMU jedinici JP EPS, da bi se povećala efikasnost, potrebno je smanjiti broj zaposlenih za 12469, poslovnu imovinu za 548953, kapital za 339215 i povećati neto dobit za 35984,19 novčanih jedinice. Determinante efikasnosti kompanija u Srbiji su ekonomska klima, efikasnost upravljanja ljudskim resursima, imovinom, kapitalom, prodajom i profitom i dr. Njihova adekvatna kontrola može značajno uticati na postizanje ciljnog profita kompanija u Srbiji.

Ključne reči: Efikasnost; Preduzeća; Srbija; DEA Super-Radijalni modeli.