



Article

# Assessment of Progress towards Achieving Sustainable Development Goals of the "Agenda 2030" by Using the CoCoSo and the Shannon Entropy Methods: The Case of the EU Countries

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Abstract: The United Nations Member States adopted the "Agenda 2030" which contains 17 sustainable development goals (SDG) that involve a certain number of targets and indicators. Although the indicators are helpful in defining the position of the current country relative to the goals' achievement, it is very complex to determine its position relative to other countries, because this requires an extensive analysis. Therefore, in this paper, the application of the multiple-criteria decision-making approach (MCDM) in defining the position of the EU (Europe Union) countries relative to the SDGs is proposed. The MCDM model is based on the Combined Compromise Solution (CoCoSo) and the Shannon Entropy methods. The final results highlight Sweden as the country that best implemented the set SD goals and has the best outputs relative to them, while Romania is in last place. The main reason for these kinds of results could be that the countries on the bottom of the list are relatively new EU members and have not been made to properly implement SDGs yet. The conclusion is that the obtained results are fully objective and rational, and that the applied model is applicable for performing this kind of analysis.

**Keywords:** CoCoSo method; Shannon Entropy method; "Agenda 2030"; sustainable development goals; EU countries; achievement; assessment

# 1. Introduction

Economic growth and industrialization have brought about many benefits, such as better standards, prosperity, and urbanization. However, this development has caused a lot of negative effects and issues on the global level that could potentially harm the well-being of future generations. Increasing industrial production in the 1960s and 1970s has led to the growth of consumerism, which was followed by massive pressure on natural resources and the environment, which eventually have led to the undermining of the nature balance [1]. Scientists and practitioners worldwide have become aware of the severity of the problem, so they started to emphasize the importance of ecological and environmental preservation, and the term sustainability was introduced. Initially, this term represented a connection between development and environment, but over time, it became broader and now includes all aspects of

development, i.e., economic, social, and environmental [2]. The goals of sustainable development that are nowadays followed are somewhat different relative to those pursued in the 1990s. Acquiring new technologies, especially information and communication, has sped up the globalization process, which provoked new economic, environmental, and social challenges [3].

To define the main priorities regarding sustainable development, the United Nations in 2000 proposed the Millennium Development Goals (MDGs). The MDGs contain eight goals referred to as environment devastation, poverty, hunger, gender inequality, and school issues, which had to be achieved until 2015. During that period, some of the countries have accomplished significant improvement towards the MDGs, while others have not. Namely, the situation varied regarding the country, the goal, and the regions. However, for nearly fifteen years, the mentioned goals were at the center of attention of policy makers worldwide. This resulted in the proposing of the new set of goals called Sustainable Development Goals (SDGs), that will be in focus for the next fifteen years [4]. Namely, United Nations Members States adopted the "Agenda 2030" in 2015, which backbone is the 17 SDGs pointed to the improvement of the overall situation in the world and hence required joint action.

SDGs contain 17 goals, as is stated previously, of which goals 1–6 belong to the earlier introduced MDGs, while goals 7–17 represent the brand new goals that bring a spotlight on the new sustainability issues. Each goal includes between 5 and 12 targets and, to better monitor the progress and gained achievement relative to the set goals and targets, about 303 indicators are proposed [5]. The creation of the targets and indicators occupied a lot of the attention and caused the discussions which resulted in their assessment, with the aim to define that there is existing adequate scientific evidence for them [6,7]. The final results have shown that about 17% of the proposed targets require revision [5], and the SD Solution Network (SDSN) proposed 100 Global Monitoring indicators as reliable. Besides, some authors argue that there are inter-linkages among the goals, which, by neglecting, could cause the contradictory final results [8].

Five years have passed from the SDGs' adoption and publication of the "Agenda 2030." There is evidence of assessment of the progress towards certain SDGs. One of the topics that is elaborated, referred to in the SDGs, is under-5 child mortality in the national, regional, and global conditions [9]. Additionally, child mortality in China for the period 1996–2015 [10] and neonatal and under-5 child mortality in Africa have been investigated [11], with assessment of the significance for achieving the SD goals. Also, the scientist observed the maternity mortality from 1990 to 2015, with projections relative to achievement of the SDGs [12]. Besides, the resources needed for financing the health systems strengthening towards achieving the SDGs in the low-income and middle-income countries are estimated [13]. The questions of the achievements reached in the field of health are elaborated in the articles of the other authors as well [14–17].

Further, how different policy models contribute or hinder the achievement of the SDGs has also been investigated [18]. Pedercini et al. [19] addressed the significance of the application of the simulation integrated models as an aid for SDGs' strategy planning. Mohammed et al. [20] studied whether there is a connection between smart growths and achieving the sustainability goals, while Salvia et al. [21] assessed mentioned achievement, but from the local and global perspective. By using a few proven actual methods, Allen et al. [22] assessed the progress of Australia towards accomplishing the SDGs. Besides the given issues, the authors have discussed the assessment of land degradation [23], sustainable well-being [24], renewable energy [25], and life below water [26] regarding the achievement of the SDGs. The presented research articles show that the authors have mainly studied achievement of the particular SD goal, and not of all of them. Bearing in mind the fact that there are 17 SDGs, the problem of the assessment of the progress towards their achievement could be considered as the Multiple-Criteria Decision-Making (MCDM) problem.

The MCDM is the field of the operational research and management science that is inclusive of the various techniques pointed to facilitation of the decision-making process [27,28]. These methods are widely used in different business fields for prioritization of the given alternatives, and they contribute

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to the increasing of the reliability of performed decision process [29–31]. The comprehensive overview of the proposed methods could be found in the articles of the following authors: Dammak et al. [32], Zavadskas et al. [33], and Zavadskas and Turskis [34]. During the time, the authors have development of certain extensions of the proposed methods based on the fuzzy, interval, or neutrosophic numbers. The state-of-art of the introduced extensions and their applications are presented in the following articles [35,36]. As it stated previously, the MCDM methods and models find their application in resolving many real-world and business problems and, only to mention some of them: tourism [37], information technologies [38], personnel selection [39], supply chain management [40], and many more.

In the area of the assessment of the progress towards achieving the SDGs, the possibilities of the MCDM methods are not fully examined and used. Therefore, the main hypothesis of the paper is that the evaluation of the progress of the considered countries will be facilitated if the assessment approach involves the application of the MCDM methods. In that way, the position of the country towards achieving the particular goal as well as its position relative to the other countries will be determined more easily and with greater extent of reliability. As a result, the adequate methodology will be proposed and the certain conclusion concerned regarding the present situation in the field of sustainability will be derived. Because of that, in this paper is proposed the application of the hybrid model based on the Combined Compromise Solution (CoCoSo) method [41] and Shannon entropy [42,43]. The guiding idea of the paper is to propose a methodology based on the MCDM, which will facilitate the estimation process of the countries' progress towards SDGs. For demonstrating and testing the applicability of the proposed hybrid model, the 17 indicators regarding the 17 SDGs for the period 2015-2018 are introduced. The evaluation was performed based on the selected indicators connected to each goal, for which the data were available. Although the evaluation and ranking are performed for all mentioned years, because of the paper length, the computational procedure is demonstrated only for data of 2016. The structure of the paper is as below displayed: Section 1 gives an explanation of the proposed methodology; Section 2 contains the case study; in Section 3, the discussion of the results are presented, and the last section presents the conclusion.

# 2. Materials and Methods

## 2.1. Data

In order to evaluate the overall progress made by the EU countries in the implementation of the strategy, the global indicator network for SDGs is introduced by the Inter-Agency and Expert Group on SDG Indicators (IAEG-SDGs). The framework was adopted in 2017 by the General Assembly, and it is not ultimate because it will be changed if the need arises to involve new indicators or replacing the existing ones. Currently, this list includes 231 indicators, but there is a need to emphasize that the global indicator framework actually involves 247 indicators, because twelve indicators repeat under certain targets [44]. For this paper, the 17 indicators relative to the 17 goals were chosen and involved in the evaluation model. The goals, relative indicators, and explanations of the indicators are presented in Table 1.

Goal Indicator Explanation People at risk of income poverty after The persons at risk of poverty and with an equalized disposable income below the risk-of-poverty limit, which is set at 60% of the national median equalized disposable income (after social transfers). No poverty social transfers The indicator is related to the Government Budget Appropriations or Outlays on research and development (GBAORD) which estimate government support to R&D activities.

The indicator estimates the share of the population aged 16 and over who report an unmet need for Government support to agricultural research and development Zero hunger  $I_2$ Goal 2 Good health and Self-reported unmet need for medical Ιa Goal 3 well-being examination and care by sex medical care because of certain reasons Quality The indicator is pointed to the share of the population between the ages of 30–34 who have successfully Goal 4 Tertiary educational attainment by sex education finished tertiary studies The indicator estimates the share of females who are board members in the companies which shares are Positions held by women in senior Goal 5 Gender equality management positions traded on the stock exchange Population having neither a bath, nor a shower, nor indoor flushing toilet in Clean water and Goal 6 The indicator represents the share of the population that does not have a bathroom and indoor toilet sanitation their household by poverty status Greenhouse gas (GHG) emissions Affordable and The indicators shows emitted number of tonnes of CO2 equivalents of energy-related GHGs in Goal 7 intensity of energy consumption particular economy per unit of consumed energy

Table 1. Goals and selected indicators.

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	Goal		Indicator	Explanation
Goal 8	Decent work and economic growth	<i>I</i> <sub>8</sub>	Real GDP per capita	The indicator represents the ratio computed by putting in the relation the real gross domestic product (GDP) to the average population of the specific year.
Goal 9	Industry, innovation and infrastructure	$I_9$	Gross domestic expenditure on R&D by sector	The indicator estimates gross domestic expenditure on R&D (GERD) as a percentage of the gross domestic product (GDP).
Goal 10	Reduced inequalities	$I_{10}$	Purchasing power adjusted GDP per capita	Gross domestic product (GDP) is a measure for the economic activity, while GDP per capita is calculated as the ratio of GDP to the average population in a particular year.
Goal 11	Sustainable cities and communities	$I_{11}$	Recycling rate of municipal waste	The indicator estimates the tonnage recycled from municipal waste divided by the total municipal waste arising.
Goal 12	Responsible consumption and production	$I_{12}$	Generation of waste excluding major mineral wastes by hazardousness	The indicator estimates all waste produced in a country.
Goal 13	Climate action	$I_{13}$	Greenhouse gas emissions	The indicator estimates the total national emissions.
Goal 14	Life below water	$I_{14}$	Bathing sites with excellent water quality by locality	The indicator estimates the number and proportion of coastal and inland bathing sites with high quality of water.
Goal 15	Life on land	$I_{15}$	Surface of terrestrial sites designated under Natura 2000	The indicator estimates the surface of terrestrial sites designated under Natura 2000.

Table 1. Cont.

Source: Eurostat [45].

The main reason for the selection of the presented indicators relies on the fact that they realistically picture the core of the considered goals by themselves. By involving all of the proposed indicators, two problems will arise: firstly, the model will be too extensive and complex to manage, and secondly, some of the indicators repeat in several goals which, eventually, could lead to inadequate results.

## 2.2. Methods

Goal 16

Goal 17

Peace, justice,

and strong

institutions

Partnerships for

# 2.2.1. Combined Compromise Solution Method

Population reporting occurrence of

crime, violence, or vandalism in their area by poverty status Official development assistance as

share of gross national income

The Combined Compromise Solution (CoCoSo) method was proposed by Yazdani et al. [41]. The CoCoSo method is based on the integration of weighted sum method and exponentially weighted product method, as follows:

$$S_i = \sum_{j=1}^n r_{ij} w_j, \tag{1}$$

The indicator shows the share of people who reported that they have a problem with crime, violence, and vandalism in their district.

The promoting of economic development in recipient countries by using official development

assistance (ODA) that involves grants or loans initiated by the official sector

$$P_i = \sum_{j=1}^n r_{ij}^{w_j},\tag{2}$$

where Si and Pi denote the sum of weighted comparability sequence and power-weighted comparability sequences of alternative i, respectively,  $w_j$  denotes weight of criterion j, and  $r_{ij}$  denotes normalized rating of alternative i according to criterion j, that is calculated as follows:

$$r_{ij} = \begin{cases} \frac{x_{ij} - \min x_{ij}}{\max x_{ij} - \min x_{ij}}; & \text{when criterion } j \text{ is benefit} \\ \frac{\max x_{ij} - \min x_{ij}}{\max x_{ij} - \min x_{ij}}; & \text{when criterion } j \text{ is cos t} \end{cases}$$
(3)

where  $x_{ii}$  denotes rating of alternative *i* according to criterion *j*.

For ranking alternatives, the CoCoSo method uses relative performance score  $k_i$ , that is calculated based on three aggregated appraisal scores  $k_{ia}$ ,  $k_{ib}$ , and  $k_{ic}$ , as follows:

$$k_{i} = \frac{1}{3}(k_{ia} + k_{ib} + k_{ic}) + (k_{ia}k_{ib}k_{ic})^{\frac{1}{3}},$$
(4)

with:

$$k_{ia} = \frac{S_i + P_i}{\sum_{i=1}^{m} (S_i + P_i)'},$$
 (5)

$$k_{\rm ib} = \frac{S_i}{\min_i S_i} + \frac{P_i}{\min_i P_i},\tag{6}$$

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$$k_{\rm ic} = \frac{\lambda S_i + (1 - \lambda)P_i}{\lambda \max_i S_i + (1 - \lambda)\max_i P_i},\tag{7}$$

where  $\lambda$  is coefficient,  $\lambda \in [0,1]$ , and it is often set to  $\lambda = 0.5$ .

# 2.2.2. Entropy Method

Entropy Method is a well-known approach that is often used for determining objective criteria weights [46]. Based on Wang and Lee [47], the procedure for determining criteria weights using entropy method is as follows:

$$w_j = \frac{1 - e_j}{\sum_{j=1}^n (1 - e_j)'},\tag{8}$$

with:

$$e_j = -\frac{1}{\ln(m)} \sum_{i=1}^m r_{ij} \ln(r_{ij}),$$
 (9)

where  $r_{ij}$  denotes normalized rating of alternative i in relation to criterion j, m is number of evaluating objects, n is number of criteria.

The normalized ratings are calculated as follows:

$$r_{ij} = \frac{x_{ij}}{\sum_{i=1}^{m} x_{ij}}. (10)$$

#### 3. Results

The assessing progress towards achieving the goals defined by the implementation of the "Agenda 2030" strategy by using CoCoSo and the Entropy methods, shown in Figure 1, can be also expressed by applying the following steps:

- Step 1. Selection of indicators for evaluation
- Step 2. Data collection
- Step 3. Determining the significance of indicators
- Step 4. Selection of countries for evaluation
- Step 5. Evaluation of selected countries
- Step 6. Ranking and comparison of selected countries

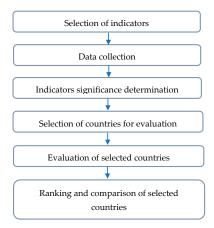


Figure 1. The assessing progress by using CoCoSo and the Entropy methods.

In this case, 27 EU countries have been evaluated based on 17 indicators adopted from "Agenda 2030" for the period 2015–2018. Due to the paper length, the computational procedure is presented only for 2016. The indicators used for evaluation are shown in Table 1 and the data regarding the considered indicators for the EU countries are presented in Table 2.

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**Table 2.** Initial decision-making matrix according to "Agenda 2030" for 2016.

	$I_1$	$I_2$	$I_3$	$I_4$	$I_5$	$I_6$	$I_7$	$I_8$	$I_9$	$I_{10}$	$I_{11}$	$I_{12}$	$I_{13}$	$I_{14}$	$I_{15}$	$I_{16}$	$I_{17}$
Belgium	15.5	37.10	99.3	45.6	28.6	0.1	36.4	34,690	2.52	33,900	53.5	3383	80.3	1271	3887	13.3	0.50
Bulgaria	22.9	15.71	193.9	33.8	15.3	10.7	9.7	6050	0.77	13,900	31.8	2527	58.2	2827	38,222	25.0	0.13
Czechia	9.7	41.07	135.0	32.8	10.1	0.2	24.8	16,520	1.68	24,900	33.6	1214	65.8	0	11,148	11.7	0.14
Denmark	11.9	96.57	108.9	46.5	27.1	0.5	14.6	46,720	3.09	36,100	46.7	1657	73.5	19,053	3594	8.4	0.75
Germany	16.5	824.67	112.0	33.2	29.5	0.0	216.9	34,700	2.94	35,100	67.1	1897	74.2	25,603	55,200	14.1	0.70
Estonia	21.7	6.49	155.8	45.4	8.8	5.1	2.8	13,650	1.25	21,700	28.1	8965	48.9	6754	8083	9.2	0.19
Ireland	16.8	95.40	96.8	54.6	16.5	0.2	11.6	50,710	1.17	50,000	40.7	1765	113.1	10,259	9226	9.7	0.32
Greece	21.2	32.98	119.4	42.7	9.1	0.2	16.8	17,110	0.99	19,300	17.2	1328	89.8	7199	35,747	11.8	0.19
Spain	22.3	401.44	94.7	40.1	20.3	0.3	82.2	23,760	1.19	25,900	33.9	1480	116.7	84,404	137,872	10.3	0.34
France	13.6	351.05	101.8	43.7	41.2	0.3	149.3	31,770	2.22	29,800	41.9	1455	85.8	41,685	70,515	14.8	0.38
Croatia	19.5	8.42	169.8	29.3	19.9	1.4	6.6	11,100	0.86	17,200	21.0	828	76.5	4986	20,704	3.0	0.07
Italy	20.6	274.80	84.6	26.2	32.3	0.1	115.9	26,020	1.37	27,700	45.9	1799	84.8	6806	57,173	14.7	0.27
Cyprus	16.1	5.51	82.4	53.4	10.8	0.7	1.8	22,360	0.52	24,700	17.2	839	150.6	131	1653	9.8	0.00
Latvia	21.8	11.00	216.6	42.8	28.5	11.7	3.8	11,030	0.44	18,300	25.2	1065	44.0	4387	7446	10.0	0.11
Lithuania	21.9	7.71	224.4	58.7	14.3	12.0	5.1	12,040	0.84	21,500	48.0	1223	42.1	1563	8086	3.4	0.14
Luxembourg	16.5	0.14	94.7	54.6	12.9	0.5	4.0	82,880	1.30	76,600	48.2	2697	87.9	0	702	12.2	1.00
Hungary	14.5	31.97	243.7	33.0	12.3	3.8	17.8	11,410	1.19	19,200	34.7	1119	65.6	0	19,949	9.7	0.17
Malta	16.5	0.28	101.6	32.0	4.5	0.0	0.6	20,260	0.57	27,000	7.0	1276	98.8	3490	41	10.4	0.20
Netherlands	12.7	104.84	97.3	45.7	27.5	0.1	49.8	39,810	2.00	36,300	53.5	2539	91.7	15,083	5520	16.9	0.65
Austria	14.1	32.13	103.7	40.1	18.1	0.2	28.1	36,430	3.12	36,500	57.6	1886	103.0	0	12,691	12.4	0.42
Poland	17.3	53.15	153.7	44.6	18.8	2.3	66.6	11,260	0.96	19,400	34.8	2090	84.5	7236	61,165	5.6	0.15
Portugal	19.0	18.56	115.5	34.6	14.3	0.9	16.2	17,010	1.28	21,900	30.9	1148	114.4	31,885	19,010	7.8	0.17
Romania	25.3	24.06	229.8	25.6	10.1	30.0	22.2	7720	0.48	16,900	13.3	1084	46.3	6362	54,214	14.1	0.11
Slovenia	13.9	6.92	114.7	44.2	24.8	0.2	4.9	18,540	2.01	23,500	55.6	1457	94.9	11	7675	8.5	0.19
Slovakia	12.7	9.58	183.1	31.5	12.5	0.8	10.4	14,550	0.79	20,600	23.0	1459	57.6	0	14,442	6.9	0.12
Finland	11.6	76.28	101.0	46.1	30.1	0.3	25.2	35,300	2.72	31,200	42.0	2595	83.1	7140	42,495	6.5	0.44
Sweden	16.2	51.85	78.7	51.0	36.9	0.0	32.1	42,910	3.25	35,000	48.4	2136	76.4	20,229	55,280	12.7	0.94

Source: Eurostat [45].

Normalized decision-making matrix, constructed using Equation (2), is shown in Table 3. The significances of indicators, obtained using Equations (8)–(11), and optimization directions of indicators are also shown in Table 3.

**Table 3.** Normalized decision-making matrix.

	$I_1$	$I_2$	$I_3$	$I_4$	$I_5$	$I_6$	$I_7$	$I_8$	I <sub>9</sub>	$I_{10}$	I <sub>11</sub>	I <sub>12</sub>	$I_{13}$	$I_{14}$	$I_{15}$	I <sub>16</sub>	I <sub>17</sub>
Weights	0.07	0.06	0.07	0.05	0.05	0.07	0.07	0.05	0.05	0.05	0.05	0.07	0.07	0.06	0.05	0.07	0.05
Optimization	min	max	min	max	max	min	min	max	max	max	max	min	min	max	max	min	max
Belgium	0.63	0.04	0.88	0.60	0.66	1.00	0.83	0.37	0.74	0.32	0.77	0.69	0.65	0.02	0.03	0.53	0.50
Bulgaria	0.15	0.02	0.30	0.25	0.29	0.64	0.96	0.00	0.12	0.00	0.41	0.79	0.85	0.03	0.28	0.00	0.13
Czechia	1.00	0.05	0.66	0.22	0.15	0.99	0.89	0.14	0.44	0.18	0.44	0.95	0.78	0.00	0.08	0.60	0.14
Denmark	0.86	0.12	0.82	0.63	0.62	0.98	0.94	0.53	0.94	0.35	0.66	0.90	0.71	0.23	0.03	0.75	0.75
Germany	0.56	1.00	0.80	0.23	0.68	1.00	0.00	0.37	0.89	0.34	1.00	0.87	0.70	0.30	0.40	0.50	0.70
Estonia	0.23	0.01	0.53	0.60	0.12	0.83	0.99	0.10	0.29	0.12	0.35	0.00	0.94	0.08	0.06	0.72	0.19
Ireland	0.54	0.12	0.89	0.88	0.33	0.99	0.95	0.58	0.26	0.58	0.56	0.88	0.35	0.12	0.07	0.70	0.32
Greece	0.26	0.04	0.75	0.52	0.13	0.99	0.93	0.14	0.20	0.09	0.17	0.94	0.56	0.09	0.26	0.60	0.19
Spain	0.19	0.49	0.90	0.44	0.43	0.99	0.62	0.23	0.27	0.19	0.45	0.92	0.31	1.00	1.00	0.67	0.34
France	0.75	0.43	0.86	0.55	1.00	0.99	0.31	0.33	0.63	0.25	0.58	0.92	0.60	0.49	0.51	0.46	0.38
Croatia	0.37	0.01	0.45	0.11	0.42	0.95	0.97	0.07	0.15	0.05	0.23	1.00	0.68	0.06	0.15	1.00	0.07
Italy	0.30	0.33	0.96	0.02	0.76	1.00	0.47	0.26	0.33	0.22	0.65	0.88	0.61	0.08	0.41	0.47	0.27
Cyprus	0.59	0.01	0.98	0.84	0.17	0.98	0.99	0.21	0.03	0.17	0.17	1.00	0.00	0.00	0.01	0.69	0.00
Latvia	0.22	0.01	0.16	0.52	0.65	0.61	0.99	0.06	0.00	0.07	0.30	0.97	0.98	0.05	0.05	0.68	0.11
Lithuania	0.22	0.01	0.12	1.00	0.27	0.60	0.98	0.08	0.14	0.12	0.68	0.95	1.00	0.02	0.06	0.98	0.14
Luxembourg	0.56	0.00	0.90	0.88	0.23	0.98	0.98	1.00	0.31	1.00	0.69	0.77	0.58	0.00	0.00	0.58	1.00
Hungary	0.69	0.04	0.00	0.22	0.21	0.87	0.92	0.07	0.27	0.08	0.46	0.96	0.78	0.00	0.14	0.70	0.17
Malta	0.56	0.00	0.86	0.19	0.00	1.00	1.00	0.18	0.05	0.21	0.00	0.94	0.48	0.04	0.00	0.66	0.20
Netherlands	0.81	0.13	0.89	0.61	0.63	1.00	0.77	0.44	0.56	0.36	0.77	0.79	0.54	0.18	0.04	0.37	0.65
Austria	0.72	0.04	0.85	0.44	0.37	0.99	0.87	0.40	0.95	0.36	0.84	0.87	0.44	0.00	0.09	0.57	0.42
Poland	0.51	0.06	0.55	0.57	0.39	0.92	0.69	0.07	0.19	0.09	0.46	0.84	0.61	0.09	0.44	0.88	0.15
Portugal	0.40	0.02	0.78	0.27	0.27	0.97	0.93	0.14	0.30	0.13	0.40	0.96	0.33	0.38	0.14	0.78	0.17
Romania	0.00	0.03	0.08	0.00	0.15	0.00	0.90	0.02	0.01	0.05	0.10	0.97	0.96	0.08	0.39	0.50	0.11
Slovenia	0.73	0.01	0.78	0.56	0.55	0.99	0.98	0.16	0.56	0.15	0.81	0.92	0.51	0.00	0.06	0.75	0.19
Slovakia	0.81	0.01	0.37	0.18	0.22	0.97	0.95	0.11	0.12	0.11	0.27	0.92	0.86	0.00	0.10	0.82	0.12
Finland	0.88	0.09	0.86	0.62	0.70	0.99	0.89	0.38	0.81	0.28	0.58	0.78	0.62	0.08	0.31	0.84	0.44
Sweden	0.58	0.06	1.00	0.77	0.88	1.00	0.85	0.48	1.00	0.34	0.69	0.84	0.68	0.24	0.40	0.56	0.94

Source: Author's calculation.

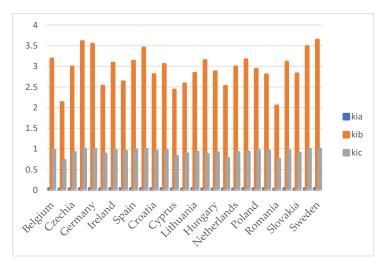
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Based on data from Table 4, the sum of weighted and power-weighted comparability sequences are calculated, using Equations (1) and (2), as it is shown in Table 4. Values of three aggregated appraisal scores  $k_{\rm ia}$ ,  $k_{\rm ib}$ , and  $k_{\rm ic}$ , obtained using Equations (5)–(7), are also presented in Table 4.

	$S_{\mathbf{i}}$	$P_{\rm i}$	k <sub>ia</sub>	$k_{ib}$	k <sub>ic</sub>
Belgium	0.56	16.08	0.039	3.28	0.97
Bulgaria	0.33	12.92	0.031	2.20	0.77
Czechia	0.49	15.09	0.037	2.95	0.91
Denmark	0.65	16.37	0.040	3.64	0.99
Germany	0.61	15.53	0.038	3.42	0.94
Estonia	0.38	14.76	0.036	2.55	0.88
Ireland	0.55	16.21	0.039	3.27	0.98
Greece	0.43	15.84	0.038	2.81	0.95
Spain	0.57	16.31	0.040	3.33	0.98
France	0.60	16.43	0.040	3.46	0.99
Croatia	0.43	15.66	0.038	2.80	0.94
Italy	0.49	16.05	0.039	3.03	0.96
Cyprus	0.43	13.65	0.033	2.64	0.82
Latvia	0.41	14.72	0.036	2.62	0.88
Lithuania	0.45	15.64	0.038	2.87	0.94
Luxembourg	0.62	14.45	0.035	3.38	0.88
Hungary	0.42	14.06	0.034	2.61	0.84
Malta	0.42	12.85	0.031	2.51	0.77
Netherlands	0.57	16.27	0.040	3.35	0.98
Austria	0.56	15.32	0.037	3.22	0.93
Poland	0.47	15.97	0.039	2.94	0.96
Portugal	0.46	15.95	0.039	2.92	0.96
Romania	0.28	12.59	0.030	2.00	0.75
Slovenia	0.54	15.74	0.038	3.18	0.95
Slovakia	0.45	14.90	0.036	2.79	0.89
Finland	0.62	16.36	0.040	3.51	0.99
Sweden	0.67	16.47	0.040	3.72	1.00

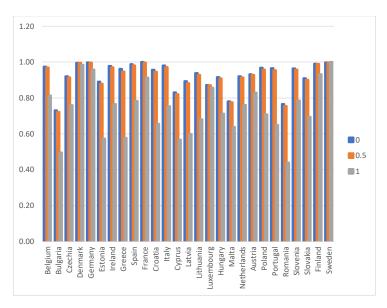
Source: Author's calculation.

The assessments of progress based on the three scores  $k_{ia}$ ,  $k_{ib}$ , and  $k_{ic}$  are shown in Figure 2, while the impact of coefficient  $\lambda$  to the  $k_{ic}$  is shown in Figure 3.



**Figure 2.** Assessments of progress based on the three scores  $k_{ia}$ ,  $k_{ib}$ , and  $k_{ic}$ .

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**Figure 3.** Impact of coefficient  $\lambda$  on  $k_{ic}$ .

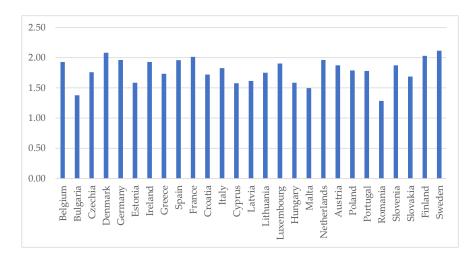
Assessment of progress towards achieving sustainable development goals of the "Agenda 2030" for 2016 has been done based on relative performance score  $k_i$ , calculated using Equation (4), as it is shown in Table 5 and in Figure 4.

**Table 5.** Assessment of progress towards achieving sustainable development goals of the "Agenda 2030" for 2016.

	$k_{\rm i}$	Rank
Belgium	1.89	6
Bulgaria	1.31	26
Czechia	1.78	15
Denmark	2.07	2
Germany	2.05	3
Estonia	1.57	23
Ireland	1.85	10
Greece	1.66	21
Spain	1.88	7
France	2.01	5
Croatia	1.73	19
Italy	1.84	11
Cyprus	1.50	25
Latvia	1.60	22
Lithuania	1.73	18
Luxembourg	1.81	12
Hungary	1.73	17
Malta	1.50	24
Netherlands	1.78	14
Austria	1.86	8
Poland	1.79	13
Portugal	1.73	16
Romania	1.31	27
Slovenia	1.85	9
Slovakia	1.71	20
Finland	2.02	4
Sweden	2.09	1

Source: Author's calculation.

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**Figure 4.** Assessment of progress towards achieving sustainable development goals of the "Agenda 2030" for 2016.

To verify obtained results about assessment of progress, similar calculations have been done with the WASAS method and SAW method with two different normalization procedures that are used in the CoCoSo and WASPAS methods. Obtained results are shown in Table 6 and Figure 5.

Table 6. Comparison of results obtained using the CoCoSo, WASPAS and SAW methods.

Belgium         9         11         10         11           Bulgaria         26         27         26         27           Czechia         16         22         14         17           Denmark         2         4         2         4           Germany         5         2         5         1           Estonia         22         23         25         25           Ireland         8         8         11         12           Greece         18         19         21         24           Spain         7         5         8         5           France         4         3         6         3           Croatia         19         15         20         16           Italy         13         10         13         13           Cyprus         24         21         19         18           Latvia         21         20         24         21           Lithuania         17         13         17         14           Luxembourg         10         12         3         6           Hungary         23         25         <					
Bulgaria 26 27 26 27 Czechia 16 22 14 17 Denmark 2 4 2 4 2 4 Germany 5 2 5 1 Estonia 22 23 25 25 Ireland 8 8 8 11 12 Greece 18 19 21 24 Spain 7 5 8 5 France 4 3 6 3 Croatia 19 15 20 16 Italy 13 10 13 13 Cyprus 24 21 19 18 Latvia 21 20 24 21 Lithuania 17 13 17 14 Luxembourg 10 12 3 6 Hungary 23 25 22 Malta 25 9 23 9 Netherlands 6 7 7 8 Austria 12 17 9 10 Poland 14 18 15 20 Fortugal 15 16 16 19 Romania 27 24 27 26 Slovenia 11 14 12 15 Slovakia 20 26 18 23 Finland 3 6 4		CoCoSo	WASPAS	SAW (mx-min)	SAW(max)
Bulgaria         26         27         26         27           Czechia         16         22         14         17           Denmark         2         4         2         4           Germany         5         2         5         1           Estonia         22         23         25         25           Ireland         8         8         11         12           Greece         18         19         21         24           Spain         7         5         8         5           France         4         3         6         3           Croatia         19         15         20         16           Italy         13         10         13         13           Cyprus         24         21         19         18           Latvia         21         20         24         21           Lithuania         17         13         17         14           Luxembourg         10         12         3         6           Hungary         23         25         22         22           Malta         25         9 <td< td=""><td>Belgium</td><td>9</td><td>11</td><td>10</td><td>11</td></td<>	Belgium	9	11	10	11
Denmark         2         4         2         4           Germany         5         2         5         1           Estonia         22         23         25         25           Ireland         8         8         11         12           Greece         18         19         21         24           Spain         7         5         8         5           France         4         3         6         3           Croatia         19         15         20         16           Italy         13         10         13         13           Cyprus         24         21         19         18           Latvia         21         20         24         21           Lithuania         17         13         17         14           Luxembourg         10         12         3         6           Hungary         23         25         22         22           Malta         25         9         23         9           Netherlands         6         7         7         8           Austria         12         17         9		26	27	26	27
Germany         5         2         5         1           Estonia         22         23         25         25           Ireland         8         8         11         12           Greece         18         19         21         24           Spain         7         5         8         5           France         4         3         6         3           Croatia         19         15         20         16           Italy         13         10         13         13           Cyprus         24         21         19         18           Latvia         21         20         24         21           Lithuania         17         13         17         14           Luxembourg         10         12         3         6           Hungary         23         25         22         22           Malta         25         9         23         9           Netherlands         6         7         7         8           Austria         12         17         9         10           Poland         14         18 <td< td=""><td>Czechia</td><td>16</td><td>22</td><td>14</td><td>17</td></td<>	Czechia	16	22	14	17
Estonia       22       23       25       25         Ireland       8       8       11       12         Greece       18       19       21       24         Spain       7       5       8       5         France       4       3       6       3         Croatia       19       15       20       16         Italy       13       10       13       13         Cyprus       24       21       19       18         Latvia       21       20       24       21         Lithuania       17       13       17       14         Luxembourg       10       12       3       6         Hungary       23       25       22       22         Malta       25       9       23       9         Netherlands       6       7       7       8         Austria       12       17       9       10         Poland       14       18       15       20         Portugal       15       16       16       19         Romania       27       24       27       26	Denmark	2	4	2	4
Ireland       8       8       11       12         Greece       18       19       21       24         Spain       7       5       8       5         France       4       3       6       3         Croatia       19       15       20       16         Italy       13       10       13       13         Cyprus       24       21       19       18         Latvia       21       20       24       21         Lithuania       17       13       17       14         Luxembourg       10       12       3       6         Hungary       23       25       22       22         Malta       25       9       23       9         Netherlands       6       7       7       8         Austria       12       17       9       10         Poland       14       18       15       20         Portugal       15       16       16       19         Romania       27       24       27       26         Slovenia       11       14       12       15	Germany	5	2	5	1
Greece       18       19       21       24         Spain       7       5       8       5         France       4       3       6       3         Croatia       19       15       20       16         Italy       13       10       13       13         Cyprus       24       21       19       18         Latvia       21       20       24       21         Lithuania       17       13       17       14         Luxembourg       10       12       3       6         Hungary       23       25       22       22         Malta       25       9       23       9         Netherlands       6       7       7       8         Austria       12       17       9       10         Poland       14       18       15       20         Portugal       15       16       16       19         Romania       27       24       27       26         Slovenia       11       14       12       15         Slovakia       20       26       18       23 <td>Estonia</td> <td>22</td> <td>23</td> <td>25</td> <td>25</td>	Estonia	22	23	25	25
Spain       7       5       8       5         France       4       3       6       3         Croatia       19       15       20       16         Italy       13       10       13       13         Cyprus       24       21       19       18         Latvia       21       20       24       21         Lithuania       17       13       17       14         Luxembourg       10       12       3       6         Hungary       23       25       22       22         Malta       25       9       23       9         Netherlands       6       7       7       8         Austria       12       17       9       10         Poland       14       18       15       20         Portugal       15       16       16       19         Romania       27       24       27       26         Slovenia       11       14       12       15         Slovakia       20       26       18       23         Finland       3       6       4       7	Ireland	8	8	11	12
France       4       3       6       3         Croatia       19       15       20       16         Italy       13       10       13       13         Cyprus       24       21       19       18         Latvia       21       20       24       21         Lithuania       17       13       17       14         Luxembourg       10       12       3       6         Hungary       23       25       22       22         Malta       25       9       23       9         Netherlands       6       7       7       8         Austria       12       17       9       10         Poland       14       18       15       20         Portugal       15       16       16       19         Romania       27       24       27       26         Slovenia       11       14       12       15         Slovakia       20       26       18       23         Finland       3       6       4       7	Greece	18	19	21	24
France       4       3       6       3         Croatia       19       15       20       16         Italy       13       10       13       13         Cyprus       24       21       19       18         Latvia       21       20       24       21         Lithuania       17       13       17       14         Luxembourg       10       12       3       6         Hungary       23       25       22       22         Malta       25       9       23       9         Netherlands       6       7       7       8         Austria       12       17       9       10         Poland       14       18       15       20         Portugal       15       16       16       19         Romania       27       24       27       26         Slovenia       11       14       12       15         Slovakia       20       26       18       23         Finland       3       6       4       7	Spain	7	5	8	5
Italy       13       10       13       13         Cyprus       24       21       19       18         Latvia       21       20       24       21         Lithuania       17       13       17       14         Luxembourg       10       12       3       6         Hungary       23       25       22       22         Malta       25       9       23       9         Netherlands       6       7       7       8         Austria       12       17       9       10         Poland       14       18       15       20         Portugal       15       16       16       19         Romania       27       24       27       26         Slovenia       11       14       12       15         Slovakia       20       26       18       23         Finland       3       6       4       7		4	3	6	3
Cyprus       24       21       19       18         Latvia       21       20       24       21         Lithuania       17       13       17       14         Luxembourg       10       12       3       6         Hungary       23       25       22       22         Malta       25       9       23       9         Netherlands       6       7       7       8         Austria       12       17       9       10         Poland       14       18       15       20         Portugal       15       16       16       19         Romania       27       24       27       26         Slovenia       11       14       12       15         Slovakia       20       26       18       23         Finland       3       6       4       7	Croatia	19	15	20	16
Latvia       21       20       24       21         Lithuania       17       13       17       14         Luxembourg       10       12       3       6         Hungary       23       25       22       22         Malta       25       9       23       9         Netherlands       6       7       7       8         Austria       12       17       9       10         Poland       14       18       15       20         Portugal       15       16       16       19         Romania       27       24       27       26         Slovenia       11       14       12       15         Slovakia       20       26       18       23         Finland       3       6       4       7	Italy	13	10	13	13
Lithuania       17       13       17       14         Luxembourg       10       12       3       6         Hungary       23       25       22       22         Malta       25       9       23       9         Netherlands       6       7       7       8         Austria       12       17       9       10         Poland       14       18       15       20         Portugal       15       16       16       19         Romania       27       24       27       26         Slovenia       11       14       12       15         Slovakia       20       26       18       23         Finland       3       6       4       7	Cyprus	24	21	19	18
Luxembourg       10       12       3       6         Hungary       23       25       22       22         Malta       25       9       23       9         Netherlands       6       7       7       8         Austria       12       17       9       10         Poland       14       18       15       20         Portugal       15       16       16       19         Romania       27       24       27       26         Slovenia       11       14       12       15         Slovakia       20       26       18       23         Finland       3       6       4       7	Latvia	21	20	24	21
Hungary       23       25       22       22         Malta       25       9       23       9         Netherlands       6       7       7       8         Austria       12       17       9       10         Poland       14       18       15       20         Portugal       15       16       16       19         Romania       27       24       27       26         Slovenia       11       14       12       15         Slovakia       20       26       18       23         Finland       3       6       4       7	Lithuania	17	13	17	14
Malta       25       9       23       9         Netherlands       6       7       7       8         Austria       12       17       9       10         Poland       14       18       15       20         Portugal       15       16       16       19         Romania       27       24       27       26         Slovenia       11       14       12       15         Slovakia       20       26       18       23         Finland       3       6       4       7	Luxembourg	10	12	3	6
Malta       25       9       23       9         Netherlands       6       7       7       8         Austria       12       17       9       10         Poland       14       18       15       20         Portugal       15       16       16       19         Romania       27       24       27       26         Slovenia       11       14       12       15         Slovakia       20       26       18       23         Finland       3       6       4       7	Hungary	23	25	22	22
Austria       12       17       9       10         Poland       14       18       15       20         Portugal       15       16       16       19         Romania       27       24       27       26         Slovenia       11       14       12       15         Slovakia       20       26       18       23         Finland       3       6       4       7		25	9	23	9
Poland       14       18       15       20         Portugal       15       16       16       19         Romania       27       24       27       26         Slovenia       11       14       12       15         Slovakia       20       26       18       23         Finland       3       6       4       7	Netherlands	6	7	7	8
Portugal       15       16       16       19         Romania       27       24       27       26         Slovenia       11       14       12       15         Slovakia       20       26       18       23         Finland       3       6       4       7	Austria	12	17	9	10
Romania       27       24       27       26         Slovenia       11       14       12       15         Slovakia       20       26       18       23         Finland       3       6       4       7	Poland	14	18	15	20
Slovenia       11       14       12       15         Slovakia       20       26       18       23         Finland       3       6       4       7	Portugal	15	16	16	19
Slovakia         20         26         18         23           Finland         3         6         4         7	Romania	27	24	27	26
Finland 3 6 4 7	Slovenia	11	14	12	15
	Slovakia	20	26	18	23
Sweden 1 1 1 2	Finland	3	6	4	7
	Sweden	1	1	1	2

Source: Author's calculation.

As it can be seen from Table 6, results obtained using the CoCoSo method are similar, or very similar, with results obtained using the WASPAS and SAW methods.

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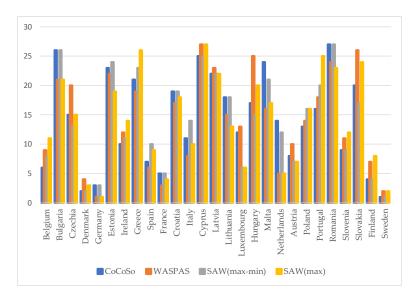


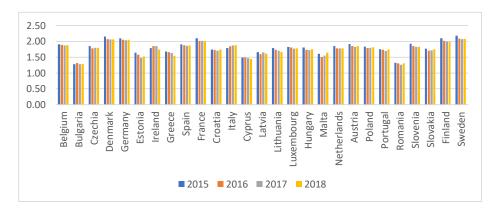
Figure 5. Comparison of results obtained using the CoCoSo, WASPAS and SAW methods.

The comparison of the introduced methodology with the proved methods such as WASPAS and SAW confirmed its applicability and the reliability of the obtained results. Therefore, we applied the proposed methodology on the data for 2015, 2017, and 2018 year to provide a more complete picture about the current state regarding the achievement of the SDGs. The gained results are presented in Table 7 and Figure 6.

**Table 7.** Assessment of progress towards achieving sustainable development goals of the "Agenda 2030" for the period 2015–2018.

	2015	Rank	2016	Rank	2017	Rank	2018	Rank
Belgium	1.91	9	1.89	6	1.87	7	1.87	7
Bulgaria	1.28	27	1.31	26	1.28	26	1.29	27
Czechia	1.85	11	1.78	15	1.79	13	1.80	12
Denmark	2.15	2	2.07	2	2.06	2	2.06	2
Germany	2.09	5	2.05	3	2.04	3	2.06	3
Estonia	1.64	23	1.57	23	1.48	24	1.53	24
Ireland	1.79	16	1.85	10	1.85	9	1.74	17
Greece	1.68	21	1.66	21	1.64	22	1.54	23
Spain	1.91	8	1.88	7	1.86	8	1.87	8
France	2.10	4	2.01	5	2.01	4	2.01	4
Croatia	1.74	20	1.73	19	1.71	18	1.74	19
Italy	1.79	15	1.84	11	1.87	6	1.88	6
Cyprus	1.48	25	1.50	25	1.47	25	1.44	25
Latvia	1.66	22	1.60	22	1.65	21	1.61	22
Lithuania	1.78	17	1.73	18	1.70	19	1.66	20
Luxembourg	1.82	13	1.81	12	1.77	15	1.78	13
Hungary	1.80	14	1.73	17	1.73	16	1.75	15
Malta	1.61	24	1.50	24	1.55	23	1.64	21
Netherlands	1.85	10	1.78	14	1.78	14	1.77	14
Austria	1.92	7	1.86	8	1.82	10	1.85	9
Poland	1.83	12	1.79	13	1.80	12	1.82	11
Portugal	1.75	19	1.73	16	1.70	20	1.74	18
Romania	1.33	26	1.31	27	1.26	27	1.30	26
Slovenia	1.92	6	1.85	9	1.82	11	1.83	10
Slovakia	1.77	18	1.71	20	1.71	17	1.75	16
Finland	2.10	3	2.02	4	2.00	5	1.98	5
Sweden	2.17	1	2.09	1	2.07	1	2.08	1

Source: Author's calculation.



**Figure 6.** Assessment of progress towards achieving sustainable development goals of the "Agenda 2030" for the period 2015–2018.

## 4. Discussion

According to the obtained results, the countries that have made the greatest prosperity towards the SDGs for the period 2015–2018 are as follows: Sweden, Denmark, Germany, France, and Finland. The final results emphasize Sweden as a country that makes the most significant progress towards achievement of the set goals of the "Agenda 2030." Observation of the input data shows that the gained achievement is not the best in all segments. Despite that, Sweden makes stable and equable progress towards all considered goals. In some areas, such as gross domestic expenditure on R&D by sector, Sweden has the best results from all EU countries. Achievements of Sweden relative to the "Agenda 2030" and expressed results have never been among the worst, but always between medium and the best, which placed Sweden as a country which makes the most considerable progress towards set SDGs.

It is interesting to note that the best-ranked countries belong to Scandinavia and Northern Europe (Sweden, Denmark, and Finland), and Western Europe (France and Germany). Besides, all of these countries joined the EU quietly long since. To be more precise, France and Germany joined the EU in 1957, Denmark in 1973, while Sweden and Finland joined the EU in 1995. The reason for good results in incorporating the positive practice relative to achievement of the sustainable development goals is that the people who live in this part of the Europe much longer work on the adopting of this practice because they are longer in the aegis of the EU. The fact that led to this kind of conclusion is as follows: on the last two positions are Bulgaria (1.38) and Romania (1.28). Both of the mentioned countries are located in Eastern Europe and both joined the EU in 2007. What does this mean? This means that these countries have not incorporated sustainability as a postulate in their policies properly, yet. They should invest time and energy in order to change the point of view and attitude towards the question of sustainable development and sustainable goals. The key issues with which Bulgaria and Romania are faced with are: poverty, high death rate, a lot of households without a bathroom and toilet in the house, low real GDP per capita, low gross domestic expenditure on R&D, low purchasing power, insufficient recycling, high rate of crime and violation. Only resolving of all the mentioned problems and improvement of all considered aspects could change the current state in the given countries and enable them to compete with first positioned countries. Only in that way, they will improve the present position and make achievement relative to the set SDGs and requirements of the "Agenda 2030."

Furthermore, the countries that possessed the first five places have relatively high GDP per capita. For illustration, according to the data from the Eurostat [48], average GDP per capita of the first-ranked Sweden for the period 2015–2018 amounts to 46,865 euros. That amount for the same period for Denmark, Finland, Germany, and France is 50,045 euros, 40,382.5 euros, 38,687.5 euros, and 33,950 euros, respectively. Romania, which is in the last position, has the GDP per capita which is five times smaller than, for example, the GDP of Sweden. The higher GDP per capita does not guarantee better achievements towards the set goals. The example of that is Luxembourg, which has extremely

high GDP per capita but it is on the twelfth to fifteenth position considering the progress towards SDGs for the observed period of time. The higher GDP points to the economic stability and prosperity of the certain country, but these do not mean that the country is automatically committed to the sustainability goals. Thus, it is evident that the countries with medium-to-high GDP per capita gain better results than that one with quite small GDP per capita. Additionally, the average net income of the households of the best-ranked countries is very high for the analyzed period of time and, for example, for the Sweden amounted to 25,559 euros in 2018 [49]. On the contrary, the net income of the households for 2018 in the last-ranked Bulgaria and Romania is 3585 euros and 3284 euros, respectively, and it is quite low for the whole considered period. When the income of the households is on the low degree, it is quite understandable that they will not invest in "green solutions." For example, investing in technologies for the use of renewable energy resources (such as, for example, geothermal energy) requires significant financial resources, but later, the operative costs are lower and these technologies enable producing of "clean" energy. This decreases the pressure on the nonrenewable resources; the GHG emissions are reduced and the sustainability goals are met. However, in the case when the income is quite modest, the less popular solutions regarding sustainability are often chosen.

With the main objective of defining the progress of the EU countries towards the SDGs, Mateusz et al. [50] applied the TOPSIS (Technique for Order Preference by Similarity) and VIKOR (Vlse Kriterijumska Optimizacija i Kompromisno Resenje) method. In the mentioned paper, Austria, Belgium, Germany, Denmark, Finland, Italy, and Luxembourg are in first place, while Bulgaria and Romania are in the last position among some other countries. For analyzing the improvements in the area of poverty in the EU, Piwowarski et al. [51] applied the TOPSIS method and VMCM (Vector Measure Construction) method. The finals results outlined Luxembourg, Finland, Austria, Malta, and Spain as the countries that have the best results towards reducing poverty. In the mentioned case, Romania and Bulgaria are in last place, again. To estimate the achieving of the sustainable development goals, Martín and Carnero [52] applied the AHP (Analytical Hierarchy Process). The obtained ranking emphasizes Norway as a country with very high sustainability, while Sweden, Denmark, the United Kingdom, and the Netherlands achieved a high degree of sustainability. In this case, Romania and Bulgaria are again among the countries that are on the very low level regarding sustainability. By observation of the results obtained by other researchers, it is obvious that there are similarities with the results presented in this paper here. As can be seen, there are some overlaps between the results regarding the first- as well as the last- positioned countries.

Finally, it can be concluded that the applied methodology is fully adequate and that the obtained results are real and justified, which confirms the stated hypothesis at the beginning of the paper. For the purpose of this paper, the combination of the Shannon Entropy and CoCoSo methods was used. The Shannon Entropy was applied for determination of the criteria weights, i.e., significance of the considered indicators. The main reason for the application of the Shannon Entropy relies in its objectivity, which enables minimizing the subjectivity onto the lowest level. The final ranking of the EU countries is performed by using the CoCoSo method, which is applicable and easy to use. Results obtained in this way represents a compromise solution that acknowledges differences among the evaluation criteria. In that way, this avoids the situation of the better ranking of countries that have good achievements only relative to certain goals, while the others are quietly bad. This compromise solution gives the perspective about the balanced achievements of the countries that are assessed. Besides, the comparison with other proved MCDM methods verified the usefulness and reliability of the proposed method. Although some authors, such as, for example, Miola and Schiltz [53], stated that the position of the country strongly depends on the chosen methodology and indicators, it could not be denied that involving the SDG indicators in the appropriate decision model would contribute to having a clear picture about sustainability level achieved in the particular country and their position relative to the others.

The main constraint of this paper is connected to involving the data for only 17 indicators in the evaluation process. By taking into consideration all proposed indicators, the obtained results will

be more robust and reliable. Besides, the estimation of the progress of the countries by each goal separately and set of indicators connected to it will enable gaining more realistic insight into the current situation in the field of sustainability, and it will contribute to better projection of future trends. Because the proposed methodology proved its usefulness in the area of the assessment of the achievements regarding sustainability, the preposition for future work involves conducting the assessment procedure based on the MCDM methods, considered goals and indicators, and targeted values. Introducing the targeted values in the assessment model will ensure acquiring of the objective results that will better illustrate the current position and progress towards desired goals and emphasize the possible shortcomings that should be resolved. Besides, the proposed model could be improved by fuzzy, grey. or neutrosophic extensions and for the determining of the weights of the criteria the objective-subjective approach could be implemented. Despite this, the model based on the Shannon Entropy and CoCoSo methods proved its applicability and proves to be very convenient for estimating the progress of the EU countries towards achieving requirements from the "Agenda 2030."

## 5. Conclusions

The main objective of this paper was to introduce a hybrid MCDM model based on the CoCoSo method and Shannon Entropy method as an aid which will contribute to the facilitation of the assessment of the progress towards achieving the SDGs. For that purpose, the application of the Shannon Entropy method for determination of the criteria weights and the CoCoSo method for the final ranking of the considered countries is proposed. The introduced methodology is based on the 17 indicators relative to the 17 SDGs. Although the greater number of indicators is introduced, the evaluation process is performed by using 17 of them, which represents the considered goals in the best way. In that way, the situation of the complex and extensive model, as well as the repeating of the indicators, is avoided.

The final results indicate Sweden as the country with the best performance according to sustainable development. The countries that have shown the worst results are Bulgaria and Romania. In order to achieve the sustainable goals, these two countries should perform serious work in many crucial areas. Comparison of the obtained results with that obtained by the other authors affirms the conclusions that are made. The final considerations are that the MCDM methods, in the present case Shannon Entropy and CoCoSo, are useful for the assessment of the progress of the countries towards SDGs and that obtained results are objective and actual.

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