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# A Novel Strategic Approach to Evaluating Higher Education Quality Standards in University Colleges Using Multi-Criteria Decision-Making

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Abstract: Universities worldwide strive to achieve excellence in research, learning, teaching, and community services, which are the pillars of their strategic plans. However, satisfying international ranking criteria might not directly result in achieving their strategic objectives. This paper proposes a new approach to rank university colleges by evaluating their educational quality. Standard sets of criteria from multiple international university ranking systems and a university's strategic plan's Balanced Scorecard perspectives were cross-mapped for the evaluation. A new multi-criteria decision-making-based framework was applied to six colleges of a non-profit university in the Middle East. It revealed their performance rankings and contributions to the university's educational quality objectives. This paper offers a novel approach for universities to develop strategies that satisfy multiple international ranking systems while achieving their strategic goals concurrently and as per their priorities. Implications include informing university leaders on the most contributing colleges and assisting in pinpointing quality shortcomings and their causes. This helps universities design better performance indicators and allocate resources to achieve educational excellence. This paper puts forward a new approach for universities to unify their efforts in satisfying the requirements of multiple international ranking systems while achieving their strategic goals.

**Keywords:** multi-criteria decision-making; international ranking systems; higher education; quality standards; strategy; universities



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# 1. Introduction

A decent education performance through its management is critical to achieving effective educational outcomes. Colleges and universities worldwide strive to achieve excellence in research, learning, teaching, and community services [1–3]. Thus, the quality of service and education provided is very important as education institutions wish to bridge any intellectual gap in all sectors of the economy. Therefore, the educational institution's administration must be effective and efficient in all managerial aspects. In order to ensure that an educational institution remains competitive, attention and control must be given to its internal affairs. One of the most critical factors to ensure the continuity of performance excellence in educational institutions is the development of measurable standards, and the indicators should be measured periodically [4].

Performance indicators have become of great importance in educational institutions. However, the difference between the scope of education, research, and composition of study programs in educational institutions makes developing quality indicators challenging [5]. Quality measures should ideally have a clear causal explanation. For instance, if the

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educational quality of student outcomes is measured within an educational institution, the performance indicators should reflect the performance of students with different characteristics across that educational institution and its programs of study. In the case of measuring the quality of departments within educational institutions, the performance indicators that reflect the quality performance of those departments must be considered. Generally, one of the most challenging aspects of quality measurement is obtaining quantitative data. Therefore, survey data and questionnaires are generally required to collect opinions from relevant experts [6]. Likewise, one of the essential tools that many institutions might apply to evaluate their performance in various aspects of their institutions is the Balanced Scorecard (BSC). The concept of a BSC has evolved beyond the simple use of perspectives, and it is now a holistic system for managing strategy. A key benefit of a disciplined framework is that it allows organizations to connect the dots between the various components of strategic planning and management [7].

Another important tool many institutions use to evaluate performance is Multi-criteria Decision Making (MCDM). The MCDM approach analyzes various alternatives and selects the optimal one [8]. Because of management's role in ensuring quality performance, the MCDM approach remains important across the education sector and other fields [9–14]. The MCDM is built based on the insight of solving planning and structural problems and challenges using multiple criteria [15]. The main objective of this paper is to rank university colleges according to their educational quality. Evaluation criteria will be determined based on common international university ranking systems as well as other criteria derived from the university strategic plan's BSC perspectives. Combining these two separate criteria is suggested as a novel strategy for evaluating university colleges' educational quality.

Education institutions face a wide range of challenges, such as providing high-quality education, achieving top world rankings, reducing costs, or increasing self-funding. Due to the rapid growth of education models, evaluation models are gradually becoming the focus of scholars' attention [16,17]. Several factors contribute to the challenges facing educational institutions. Therefore, the educational institution must be evaluated at all levels to be successful. For this reason, it is important to develop quality performance indicators for assessing educational departments. This will allow decision-makers to make informed decisions that contribute to the organization's success. The main objective of this paper is to generate a new approach to ranking the university faculties by evaluating their educational quality. A standard set of criteria from multiple common international university ranking systems, as well as other criteria derived from the BSC perspectives of the strategic plan by a university, were the basis for the evaluation. Moreover, this paper employs the MCDM approach to rank university colleges based on the criteria developed and derived from BSC and other international ranking education systems. Consequently, the following question will be answered in this paper:

How can the higher education quality of university colleges be evaluated using criteria derived from the BSC's perspectives of its strategic plan and simultaneously using standard criteria of international ranking systems?

The rest of the paper is structured as follows: Section 2 presents current research studies using BSC and MCDM techniques to evaluate the educational sector. Section 3 describes the novel proposed strategy for universities to achieve their educational quality objectives in a step-by-step fashion. Section 4 presents its application and results. Section 5 presents a discussion of the findings from the novel strategy, while the conclusions are presented in Section 6.

# 2. Literature Review

Educational Institutions may establish programs or assessment processes to discover and encourage practical management approaches. Previous studies have explored various quality evaluation and performance appraisal aspects across multiple service sectors,

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including education, healthcare, hospitality, tourism, and the public or private sectors [6]. In the education sector, university colleges are evaluated based on their quality performance, which requires the management to implement appropriate measures and balances to ensure quality [18–21].

The BSC is one of the most extensively utilized tools in gauging and improving quality in higher education institutions. A study performed such research to ascertain the efficacy of such a tool in German and Austrian educational institutions [22]. It analyzes the substantive similarities and differences between the BSC of four universities in Germany and Austria: Johannes Gutenberg University Mainz, Munster University of Applied Sciences, Cologne University of Applied Sciences, and Montan University Leoben. It was suggested that the BSC gives a holistic perspective of the method used by a higher education institution by comparing the BSC utilized by four distinct educational establishments [22]. It guarantees a comprehensive and sophisticated framework for executing and regulating the strategy and establishes a foundation for future learning in the strategy formulation of the higher educational institution following the scheme "plan-do-check-act". The BSC has also been proven effective in the United States. Similar research was performed in another study to establish the tool's efficacy in gauging quality within higher education institutions to demonstrate that the BSC may be an effective instrument for assessing the accomplishments of educational institutions, namely, universities [23]. Furthermore, a possible implication of utilizing the BSC was established to improve the quality of instruction in higher education colleges by determining how effective the BSC model is in improving the overall performance of prospective private institutions where performance was the dependent variable [24], In the BSC, the customer dimension, financial dimension, internal business process dimension, and the outlook of the growth procedure and acquiring knowledge are considered independent variables [25–29]. In that study [24], a sample size of one hundred individuals was used, representing more than half of the undergraduates currently enrolled as active students at the University of WR Supratman Surabaya. The findings indicate that while the approach effectively gauges performance, combining it with other approaches is necessary to evaluate the more nuanced performance and quality improvement aspects [24].

Performance and quality improvement approaches have also been adopted following a bottom-up approach. This was applied at the University of Minho to build the university's vision and achieve its sustainability with a comprehensive and all-encompassing view, illustrating the participation of the academic community and the top management in the process [30].

The primary focus of most of the research on assessing quality in higher education has been private institutions. However, only a few studies have adopted a different approach by choosing public institutions that are not focused primarily on the profit dimension [31]. The researchers examined current research published in reputable publications that applied the BSC Framework to higher education institutions using contextual analysis and highlighted the pertinent viewpoints for higher education institutions. When implemented, it will be possible to monitor their performance and provide them with the ability to adapt to new difficulties that arise as a direct consequence of putting essential strategies into action. The conclusion drawn from this finding is that private institutions utilized contemporary BSC viewpoints. However, public establishments used conventional perspectives with minor adjustments to the titles and the orders of the perspectives. For instance, the stakeholder viewpoint was employed in certain studies instead of the customer perspective. The available data demonstrate that the BSC has been used in a wide range of settings within the framework of higher education institutions, producing observable effects.

MCDM is another crucial approach used in making decisions in higher education institutions. For instance, it was used to evaluate the tool's implications at the Teaching Hospitals of Yazd University of Medical Sciences [32]. Literature research and qualitative techniques were utilized to gather expert opinions on the quality characteristics of hospital and education services. Following that, the views of three hundred patients on the quality

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of the provided services were acquired via a questionnaire that was created. The Fuzzy Analytic Hierarchy Process (FAHP) approach was used to assign weights to each quality parameter, and the Technique for Order of Preference by Similarity to the Ideal Solution (TOPSIS) method was utilized to rank hospital wards. According to the results, MCDM approaches effectively prioritize the aspects that influence the quality of education and health services [33–35]. As a result, decision-makers in government may use them to prepare for and enhance the provision of services in academic progress and health.

Departments offering engineering programs in a public university in the Middle East were evaluated using a combination of MCDM methodologies by representing the administration of the public institution assessed using fifteen criteria. The study suggested that low-performing departments should be encouraged to produce more research articles by offering various forms of incentives to their academic members [36].

An integrated MCDM approach to evaluate several lectures to determine whether e-learning technology can be evaluated in an industrial engineering department of a Turkish university. The study evaluated many factors using MCDM methods in e-learning applications [37,38].

Many BSC studies have successfully applied AHP because of its ability to aid organizations or firms in selecting alternative missions/visions, strategies, and resource allocations to implement organizational strategies and objectives [39–46].

AHP is a technique that considers both quantitative and qualitative factors while assessing a problem's viability. The BSC model's analytical framework was developed using AHP and Analytic Network Process (ANP), two multiple-criteria decision-making approaches. AHP is a decision-making framework created by Saaty that considers several factors [47]. Despite the AHP approach's presumption that the components provided in the hierarchical structure are independent, it may be unsuitable due to the influence of specific internal and external factors. Due to this, the ANP technique is required [48]. The BSC framework was created because of the limitations of the conventional financial approach to measuring business success. Of course, BSC is not perfect. The ANP technique compensates for these drawbacks by assigning importance weights to individual indicators. ANP generalizes the hierarchical relationship between criteria and options using a network perspective. Because of the interplay and dependency between higher and lower-level components, many decision issues defy traditional hierarchical organization [49]. Different performance metrics may be investigated using ANP.

The VIšekriterijumsko KOmpromisno Rangiranje (VIKOR) method may be used to rank each option according to how well it meets each criterion [50,51]. VIKOR is based on the compromise programming of MCDM, namely, comparing the "closeness" metric to the "ideal" alternative. In compromise programming, the Lp-metric is employed as an aggregating function, and from this, the multi-criteria measure for compromise ranking was constructed [52,53]. VIKOR and TOPSIS are well-known MCDM approaches. They both use the idea of compromise to solve the conflicting dilemma among the assessment criteria and then rate the order of the options [54]. TOPSIS technique has a blind spot that prevents it from being utilized for ranking purposes. Thus, it reveals where improvements may be made to the criteria to reach the desired/aspired level [51].

The Decision-Making Trial and Evaluation Laboratory (DEMATEL) technique is used to identify interdependencies and reciprocal influences among viewpoints [55]. One way to look at the work of creating a strategy map is as part of a more extensive, holistic group decision-making process. The DEMATEL technique uses group wisdom to identify and record the unintentional links between several strategic criteria [56]. The cause-and-effect analysis tool DEMATEL was employed to determine which BSC metrics are most telling [57].

A demonstration of how webometrics rankings could be measured using reliable quantitative information by applying TOPSIS and VIKOR methods to university websites was published [58]. In many universities worldwide, the measures have significantly changed their competitive nature. The VIKOR method is one of the better models that

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higher education stakeholders and researchers have identified to help provide better webometric data and rankings for university sites. As a result of the approach, academic prestige and quality of education will be improved [59].

The Six-Sigma framework has also been advocated to improve higher education quality. A study was conducted to evaluate the consequences of such an approach in enhancing educational results in higher education institutions [60]. This study aimed to demonstrate the potential applications of Lean Six Sigma (LSS) in higher education services and to offer a conceptual framework for implementing LSS in higher education facilities. The objective was to provide an overview of the significance of the quality perfection criteria in general by using a variety of constructs drawn from the relevant research, such as Total Quality Management (TQM), Lean, Six Sigma, and LSS. In the study, more significant consideration was given to the relevance of LSS in the context of Higher Education Institutions (HEI). Similar to other studies, validating the application of LSS in HEIs was found to be highly important [61,62].

## 3. The Proposed Strategy

The main goal of this paper is to rank university colleges by assessing their educational quality. This evaluation is to be completed using standards criteria from the common international university ranking systems and other criteria from a university strategic plan's BSC perspectives. A novel strategy is suggested to evaluate the educational quality of university colleges by combining the criteria from these two separate sources. The strategy is broken down into three main phases, as shown in Figure 1. In the first phase, a cross table is created by combining the standards' criteria from the chosen international university ranking systems and the criteria from the BSC perspectives. The second phase offers a method for weighting every type of criterion considered in the first phase. Then, the university colleges will be ranked in the third phase by applying the Ranking of the Alternatives using the Trace to Median Index (RATMI) technique [17] as one of the recent MCDM tools, based on the weighted set of criteria. These three phases are further detailed subsequently.

# 3.1. Phase 1: Identify the Education Quality Standards

Step 1.1: Several systems produce worldwide university rankings based on different standards that maximize the university's potential through educational achievements, international mobility, professional development, and other standards. Here, in this step, based on recommendations of the university's top administration, select a set of international university-ranking systems aligned with the university's vision.

Step 1.2: Each International University Ranking System (IURS) has its own standard criteria for judging the university's excellence. These standards' criteria range from broad areas of interest, such as academic reputation and quality of education, to more focused ones, such as the faculty-to-student ratio and institutional income/academic staff. On the other hand, the university has its own standard criteria that help it achieve its strategic objectives and fulfill its responsibility to the local and international community. So, in this step, identify the university's standards' criteria and the other international systems chosen. Let  $S_u$  be the number of standards' criteria at system  $S_u$ , where  $S_u$  and  $S_u$  is the total number of chosen ranking systems, including the university as an educational organization.

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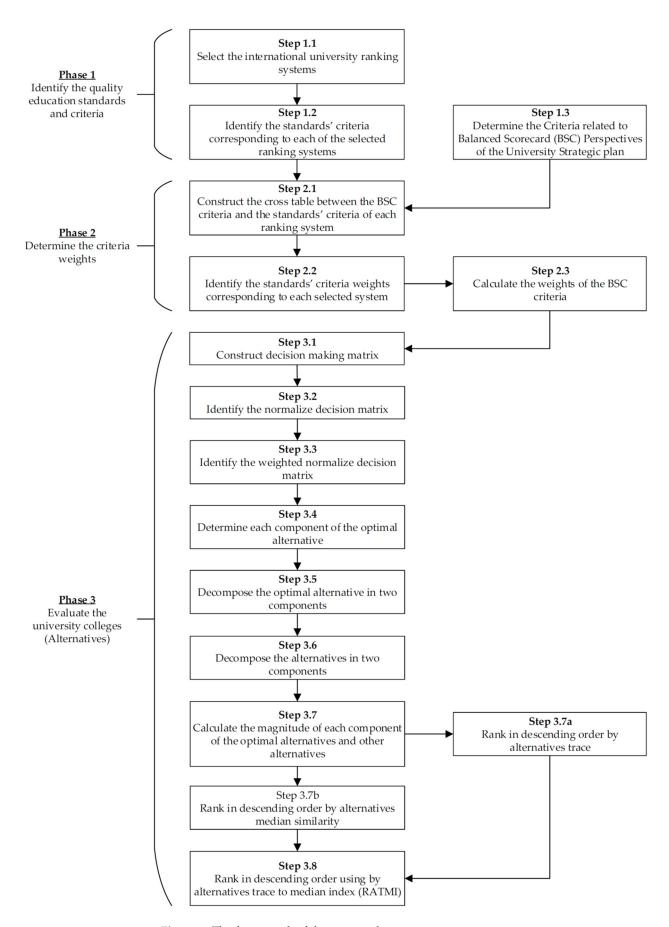


Figure 1. The framework of the proposed strategy.

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Step 1.3: The BSC is a strategic planning management system that is frequently used to evaluate the performance of the universities from four important perspectives: finances, learning and growth, internal processes, and customers. As a result, the university creates Key Performance Indicators (KPIs) to deliver the results required from each perspective. In this step, determine the KPIs (i.e., the criteria) associated with each perspective of the university's BSC. Let 'F', 'G', 'P', and 'E' stand for the total number of criteria on finance, learning and growth, internal processes, and customer perspectives, respectively.

# 3.2. Phase 2: Determine the Criteria Weights

Step 2.1: Construct a cross table between the standards' criteria used by 'U' systems and the criteria of the university's BSC. The table has 'V' rows, where V = F + G + P + E, and 'W' columns, where  $W = \sum_{u=1}^{U} S_u$ . In this table, the intersection cell indicates whether or not there is a relationship between the row criteria and column standards' criteria. Put '1' if there is a relationship at the intersection cell and '0' otherwise. Let  $M_{iuj}$  be a binary value (0 or 1) at the intersection cell that represents the standards' criteria  $i, j = 1, \ldots, S_u$  of the system  $u, u = 1, \ldots, U$  and has a relationship with the criteria  $i, i = 1, \ldots, V$  of the university's BSC.

Step 2.2: Determine the weights assigned to each standard's criteria by the system u, u = 1, ..., U. The standards' criteria of each IURS are available to the public on the internet, while the university standards' criteria are assigned by a panel of experts from the top administration of the university using the AHP technique. The sum of the standards' criteria weight at each system is 1. Let ' $T_{uj}$ ' be the weight of the standards' criteria j at system u, where  $j = 1, ..., S_u$  and u = 1, ..., U.

Step 2.3: Calculate the weight of the criteria related to each perspective of the university's BSC. The most common methods used to determine the criteria weights are AHP and Best-Worst-Method (BWM). These two methods are based on the pairwise comparison. The number of pair comparisons is n(n-1)/2 for the AHP technique and (2n-3) for BWM. When there are many criteria (i.e., n>7), pair comparisons grow in size, and people become too confused to give accurate answers when there are too many inquiries about the same issue [37]. A mathematical method is suggested to determine the weights for the criteria relevant to the perspectives of the university's BSC. According to Equations (1)–(5), each criterion's weight is equal to its score divided by the total scores of all criteria stated in the cross table.

$$TS = \sum_{i=1}^{V} \sum_{u=1}^{U} \sum_{j=1}^{S_u} M_{iuj} \times T_{uj}, \tag{1}$$

$$f_i = Sf_i/TS = \left(\sum_{u=1}^{U} \sum_{j=1}^{S_u} M_{iuj} \times T_{uj}\right)/TS \ \forall i \in [1, 2, \dots, F],$$
 (2)

$$g_i = Sg_i/TS = \left(\sum_{u=1}^{U} \sum_{j=1}^{S_u} M_{iuj} \times T_{uj}\right)/TS \ \forall i \in [1, 2, ..., G],$$
 (3)

$$p_{i} = Sp_{i}/TS = \left(\sum_{u=1}^{U} \sum_{j=1}^{S_{u}} M_{iuj} \times T_{uj}\right)/TS \ \forall i \in [1, 2, \dots, P],$$
 (4)

$$e_i = Se_i/TS = \left(\sum_{u=1}^{U} \sum_{j=1}^{S_u} M_{iuj} \times T_{uj}\right)/TS \ \forall i \in [1, 2, \dots, E]$$
 (5)

where  $Sf_i$  indicates the score of each financial criterion i,  $Sg_i$  indicates the score of each learning and growth criterion i,  $Sp_i$  indicates the score of each internal process's criterion i,  $Se_i$  indicates the score of each customer criterion i, and TS indicates the total scores of all criteria in the cross table. Additionally,  $f_i$  represents the weight of each criterion related to those relevant to financial perspective,  $g_i$  represents the weight of each criterion related to those relevant to learning and growth perspective,  $p_i$  represents the weight of each criterion related to those relevant to the internal processes perspective, and  $e_i$  represents the weight of each criterion related to those relevant to customers' perspectives.

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# 3.3. Phase 3: Rank the University Colleges (Alternatives)

Step 3.1: Construct the problem data in the form of a decision-making matrix  $X_{ij}$ :

$$D = \begin{bmatrix} x_{ij} \end{bmatrix}_{mxn} = \begin{bmatrix} A/C & C_1 & C_2 & \dots & C_n \\ A_1 & x_{11} & x_{12} & \dots & x_{1n} \\ A_2 & x_{21} & x_{22} & \dots & x_{2n} \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ A_m & x_{m1} & x_{m2} & \dots & x_{mn} \end{bmatrix},$$
 (6)

where  $A = [A_1, A_2, ..., A_m]$  is a given set of university colleges (alternatives), and m is the total number of alternatives.

 $C = [C_1, C_2, \dots, C_n]$  is a given set of criteria, and n is the total number of criteria. Some of the criteria should be maximized, while some should be minimized.

 $[x_{ij}]_{mxn}$  is an assessment of alternative  $A_i$  with respect to a set of criteria.

Step 3.2: Normalization of problem data. Since each criterion is described by its corresponding dimension, the problem data are multidimensional. It is hard to make decisions in this situation. To avoid these difficulties, the multidimensional decision space must be converted into a nondimensional decision space. Here, in this step, determine the normalization in the following manner for the maximum criteria:

$$r_{ij} = \frac{x_{ij}}{\max_i(x_{ij})}, \forall i \in [1, 2, \dots, m] \land j \in S_{max}$$
(7)

while for the minimum criteria:

$$r_{ij} = \frac{\min_{i}(x_{ij})}{x_{ij}}, \forall i \in [1, 2, \dots, m] \land j \in S_{min}$$
(8)

where:

 $S_{max}$  is a set of criteria that should be maximized.

 $S_{min}$  is a set of criteria that should be minimized.

As a result, the normalized decision matrix will have the following form:

$$R = \begin{bmatrix} r_{ij} \end{bmatrix}_{mxn} = \begin{bmatrix} A/C & C_1 & C_2 & \dots & C_n \\ A_1 & r_{11} & r_{12} & \dots & r_{1n} \\ A_2 & r_{21} & r_{22} & \dots & r_{2n} \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ A_m & r_{m1} & r_{m2} & \dots & r_{mn} \end{bmatrix}$$
(9)

Step 3.3: Weighted normalization. Perform the weighted normalization as follows for normalized assessment  $r_{ij}$ :

$$u_{ij} = w_i r_{ij}, \forall i \in [1, 2, \dots, m], \forall j \in [1, 2, \dots, n]$$
 (10)

where

 $w_j$  is a weight of criterion j that can be determined either from a group of experts or from using one of the MCDM tools, such as the AHP technique. The sum of the weights must equal one:  $\sum_{j=1}^{n} w_j = 1$ .

Then, the weighted normalization matrix can be formed as follows:

$$U = \begin{bmatrix} u_{ij} \end{bmatrix}_{mxn} = \begin{bmatrix} A/C & C_1 & C_2 & \dots & C_n \\ A_1 & u_{11} & u_{12} & \dots & u_{1n} \\ A_2 & u_{21} & u_{22} & \dots & u_{2n} \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ A_m & u_{m1} & u_{m2} & \dots & u_{mn} \end{bmatrix}$$
(11)

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Step 3.4: Determination of optimal alternative. Determine each component of the optimal alternative as follows:

$$q_j = \max(u_{ij} | 1 \le j \le n), \forall i \in [1, 2, \dots, m]$$

$$\tag{12}$$

The optimal alternative is represented by the following set:

$$Q = \{q_1, q_2, \dots, q_i\}, j = 1, 2, \dots, n$$
(13)

Step 3.5: Decomposition of the optimal alternative. Decompose the optimal alternative in the two sets or two components.

$$Q = Q^{max} \cup Q^{min} \tag{14}$$

$$Q = \{q_1, q_2, \dots, q_k\} \cup \{q_1, q_2, \dots, q_h\}; k + h = j$$
 (15)

where:

*k*: represents the total number of criteria that should be maximized.

h: represents the total number of criteria that should be minimized.

Step 3.6: Decomposition of the alternative. Similar to step 3.5, decompose each alternative.

$$U_i = U_i^{max} \cup U_i^{min}, \forall i \in [1, 2, \dots, m], \tag{16}$$

$$U_i = \{u_{i1}, u_{i2}, \dots, u_{ik}\} \cup \{u_{i1}, u_{i2}, \dots, u_{ih}\}; \forall i = [1, 2, \dots, m]$$
(17)

Step 3.7: Magnitude of components. For each component of the optimal alternative, calculate the magnitude defined via:

$$Q_k = \sqrt{q_1^2 + q_2^2 + \dots q_k^2},\tag{18}$$

$$Q_h = \sqrt{q_1^2 + q_2^2 + \dots q_h^2} \tag{19}$$

The same approach is applied to each alternative.

$$U_{ik} = \sqrt{u_{i1}^2 + u_{i2}^2 + \dots u_{ik}^2}, \forall i = [1, 2, \dots, m]$$
 (20)

$$U_{ih} = \sqrt{u_{i1}^2 + u_{i2}^2 + \dots u_{ih}^2}, \forall i = [1, 2, \dots, m]$$
(21)

From this point, the following two methods were developed to create the rank of alternatives:

Step 3.7a: Ranking by Alternatives Trace. Create the matrix *F* composed of optimal alternative components:

$$F = \begin{bmatrix} Q_k & 0\\ 0 & Q_h \end{bmatrix} \tag{22}$$

Create the matrix  $G_i$  composed of alternative components:

$$G_j = \begin{bmatrix} U_{ik} & 0 \\ 0 & U_{ih} \end{bmatrix}, \forall i = [1, 2, \dots, m]$$
(23)

Create the matrix  $T_i$  as follows:

$$T_i = F \times G_j = \begin{bmatrix} t_{11;i} & 0 \\ 0 & t_{22;i} \end{bmatrix}, \forall i = [1, 2, \dots, m]$$
 (24)

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Then, the trace of the matrix  $T_i$  is as follows:

$$tr(T_i) = t_{11;i} + t_{22;i}, \forall i = [1, 2, ..., m]$$
 (25)

Alternatives are now ranked according to the descending order of  $tr(T_i)$ .

Step 3.7b: Ranking by Alternatives Median Similarity. The median of the optimal alternative is expressed as the median of the right angle. Components  $Q_k$  and  $Q_h$  represent the base and perpendicular side of this triangle.

$$M = \left(\sqrt{Q_k^2 + Q_h^2}\right)/2\tag{26}$$

Median similarity represents the ratio between the perimeter of each alternative and the optimal alternative:

$$MS_i = \frac{M_i}{M}, \forall i = [1, 2, \dots, m]$$
(27)

Alternatives are now ranked according to the descending order of  $MS_i$ .

Step 3.8: Ranking the alternatives based on the RATMI technique. The median of the optimal alternative is expressed as the median of the right angle. If v is the weight of the Multiple Criteria Ranking by Alternative Trace (MCRAT) strategy and (1 - v) is the weight of Ranks Alternatives based on the Median Similarity (RAMS) strategy, then the majority index  $E_i$  between the two strategies is as follows:

$$E_{i} = v \frac{\left(tr_{i} - tr^{*}\right)}{\left(tr^{-} - tr^{*}\right)} + (1 - v) \frac{\left(MS_{i} - MS^{*}\right)}{\left(MS^{-} - MS^{*}\right)}$$
(28)

where:

 $tr_i = tr(T_i), \forall i = [1, 2, ..., m].$   $tr^* = \min(tr_i, \forall i = [1, 2, ..., m]).$   $tr^- = \max(tr_i, \forall i = [1, 2, ..., m]).$   $MS^* = \min(MS_i, \forall i = [1, 2, ..., m]).$   $MS^- = \max(MS_i, \forall i = [1, 2, ..., m]).$ v is a value from 0 to 1. Here, v = 0.5.

#### 4. Application and Results

The information used to make the ranking decision, including the evaluation criteria, came from the non-profit XYZ University in the Middle East region. XYZ University has six colleges with more than twenty active programs providing undergraduate and graduate instruction. The Middle East is an area that has experienced rapid growth in higher education in recent years. By focusing on this region, we aim to address the need for strategic evaluation approaches that can be tailored to the unique characteristics of the Middle Eastern higher education landscape. The six selected colleges represent a wide range of disciplines, from engineering and natural sciences to humanities and social sciences. This diversity allowed us to explore the applicability of our proposed MCDM approach across different academic fields and to demonstrate its versatility, which allows exploring the applicability of their proposed MCDM approach across different academic fields. The colleges primarily deal with the fields of architecture (A1), management (A2), technology (A3), engineering (A4), science (A5), and law (A6). Some of the programs have local accreditation, while others have international accreditation. However, one of the university's strategic objectives is to obtain international accreditations for all its programs, besides obtaining a high ranking worldwide. The following is an application of the three phases mentioned earlier to rank the university colleges according to the standards of educational quality and weighted criteria.

## 4.1. Phase 1: Identifying the Education Quality Standards

In accordance with steps 1.1 and 1.2, a panel of specialists from the university's top administration chose five international systems that rank universities according to certain standards' criteria and weights. The systems selected and the associated data are shown in Table 1.

**Table 1.** The selected systems with their associated standards' criteria and weights.

Ranking System	Ranking Standards' Criteria	Weights
	S1-1 Teaching (the learning environment)	0.30
	S1-2 Research (volume, income, reputation)	0.30
Times Higher Education World University	S1-3 Citations (research influence)	0.30
Rankings (THE)	S1-4 International Outlook (staff, students, research)	0.075
<b>3</b> . ,	S1-5 Industry Income (knowledge transfer)	0.025
	Total sum	1
	S2-1 Academic Reputation	0.40
	S2-2 Employer Reputation	0.10
	S2-3 Faculty-Student Ratio	0.20
QS World University Rankings (QS)	S2-4 Citations per Faculty	0.20
	S2-5 International Faculty Ratio	0.05
	S2-6 International Student Ratio	0.05
	Total sum	1
	S3-1 Quality of Education (alumni who have won Nobel prizes)	0.10
Academic Ranking of World Universities	S3-2 Quality of Faculty in terms of staff winning Nobel prizes and Highly Cited (HiCi) classified staff	0.40
(ÅRWU)	S3-3 Research Output (papers published in N&S and PUB)	0.40
	S3-4 Per Capita Performance (PCP)	0.10
	Total sum	1
	S4-1 Visibility	0.50
TATAL Color D CTAT LLTT	S4-2 Transparency (openness)	0.10
Webometrics Ranking of World Universities (WEB)	S4-3 Excellence (scholar)	0.40
(**15)	Total sum	1
	S5-1 Setting and Infrastructure	0.15
	S5-2 Energy and Climate Change	0.21
	S5-3 Waste	0.18
UI GreenMetrics World University Rankings (UI)	S5-4 Water	0.10
	S5-5 Transportation	0.18
	S5-6 Education and Research	0.18
	Total sum	1
	S6-1 Curriculum	0.23
	S6-2 Academic Staff	0.17
	S6-3 Infrastructure	0.16
YV7 University	S6-4 E-Services	0.11
XYZ University	S6-5 Community Services	0.10
	S6-6 Library Services	0.13
	S6-7 Administrative Services	0.10

The five international systems considered in this research are Times Higher Education (THE), Quacquarelli Symonds (QS), Academic Ranking of World Universities (ARWU), Webometrics Ranking of World Universities, and Universitas Indonesia GreenMetric (UI) GreenMetric. THE compiles university rankings to evaluate academic institutions worldwide and to help the public learn more about the varied goals and achievements of the

world's top universities [63]. QS, the world's preeminent provider of services, analytics, and insight into the global higher education sector, aims to help ambitious people everywhere realize their full potential by pursuing higher education, traveling the world, and advancing their professional careers [64]. First released in June 2003 by the Center for World-Class Universities (CWCU), Graduate School of Education (previously the Institute of Higher Education) of Shanghai Jiao Tong University, China, the Academic Ranking of World Universities (ARWU) is updated annually. Shanghai Ranking Consultancy has owned the publication rights to the ARWU since 2009. Shanghai Ranking is not legally subservient to any institutions or government organizations, making it a truly independent company in higher education intelligence [65]. The Cybermetrics Lab of the Consejo Superior de Investigaciones Cientficas (CSIC), the biggest public research agency in Spain, is responsible for compiling the "Webometrics Ranking of World Universities" [66]. In 2010, Universitas Indonesia launched the UI GreenMetric World University Rating, a ranking focused on green campuses and environmental sustainability. The UI GreenMetric World University Rankings carefully determined the rankings based on institutions' environmental commitment and projects using 39 indicators across 6 categories [67].

Furthermore, an additional six standards criteria were chosen based on the strategic plan of XYZ University. With respect to step 1.3, Table 2 displays the criteria for the four BSC perspectives. A financial perspective, learning and growth perspective, internal processes perspective, and customer perspective are the four pillars of a BSC. Universities may boost their external results by focusing on and optimizing their processes using a BSC, a strategic management performance tool. It considers historical performance metrics and provides universities with helpful advice for improving their future decision-making [68].

**Table 2.** The criteria related to XYZ University's Balanced Scorecard (BSC) perspectives.

	Financial Perspective	
F1. Research income per academic staff	F4. Annual budget allocated by the university	F7. Conventional to smart implementation ratio (in %)
F2. Total income from contracts with industry F3. The annual revenue from postgraduate programs	F5. Percentage implementing recycling programs F6. Percentage implementing paperless practices	F8. Water conservation program implementation (Yes/No) F9. The ratio of surface parking spaces to the building's overall area
	Learning and Growth Perspective	
G1. Percentage of operation and maintenance activities of the building during the COVID-19 pandemic	G9. Number of teaching staff (Ph.D. holders)	G17. Percentage satisfied with academic and administrative services provided on the website
G2. Percentage of satisfaction from special needs facilities G3. Percentage satisfied with health facilities G4. Percentage satisfied with security and safety facilities	G10. Number of full professors (excluding retired) G11. Number of Highly Cited (HiCi) academic staff G12. The number of faculty divided by the number of students	G18. Percentage satisfied with appealing and efficiently arranged website G19. E-services prompt technical support (Yes/No) G20. E-services are accessible in different ways (Yes/No)
G5. Percentage availability of up-to-date books and journals	G13. Number of staff with an h-index greater than 20	G21. The website shows the research outcomes by academic staff and students (Yes/No)
G6. Availability of E-library (Yes/No)	G14. Percentage of academic staff with foreign citizenship	(160) 110)
G7. Rate sufficient places to sit and read (from 1 to 5)	G15. Number of doctoral staff awarded international prizes	
G8. Percentage attracting high-caliber teaching staff	G16. Number of staff who earned a Ph.D. from top 100 universities (THEMS ranking)	

Table 2. Cont.

	<b>Internal Processes Perspective</b>	
P1. Percentage of students with	P9. The proportion of international	P17. Rate the availability of sporting
foreign citizenship	postgraduate students	facilities (from 1 to 5)
P2. Number of accredited	P10. The average number of	P18. Percentage satisfied with
programs internationally	published papers	medical services
P3. Number of accredited programs locally	P11. Number of ISI (Q1) papers published over the last five years	P19. Student's hostel (Yes/No)
P4. The ratio of sustainability courses to	P12. Number of Scopus (Q1) papers	P20. Friendliness of advising system
total courses/subjects	published over the last five years	(Yes/No)
P5. Number of Ph.D.s awarded by the college	P13. Average citations per paper annually	P21. Rate the availability of administrative materials for services (from 1 to 5)
P6. Percentage of satisfaction with the current academic advising	P14. Number of citations in last five years divided by the number of staff members	P22. Rating of the clarity of administrative guidelines and advice (from 1 to 5)
P7. Number of curriculums or programs aligned with requirements of the labor market	P15. Number of certified labs	P23. Number of initiatives during the COVID-19 pandemic
P8. The curriculum enhances student skills and self-capabilities (Yes/No)	P16. Rate the availability of catering services (from 1 to 5)	
	<b>Customer Perspective</b>	
E1. Number of community services related to sustainability	E3. Number of international collaborations	E5. Number of prizes awarded to the college
E2. Number of scientific societies	E4. Number of bachelor or master's students awarded prizes	-

# 4.2. Phase 2: Determining the Criteria Weights

As indicated in Figure 2, the cross table between the criteria of the four BSC perspectives at XYZ University and the standards' criteria of the international university ranking systems is produced in accordance with step 2.1. Experts from the university's highest management represented the relationship between each criterion and each standard's criteria using binary values, 0 or 1. The value 1 denotes a link, while the value 0 indicates none. In Figure 2, the intersection cell with a 0-value has been left blank to clarify the table visually. As per step 2.2, the weights of the standards' criteria used by university ranking systems are given in Table 1. Equations (1)–(5) illustrated in step 2.3 were used to determine the weights of the educational quality criteria of the university colleges. The results of this step are shown in Table 3.

**Table 3.** The educational quality criteria, scores, and relative weights.

				7	Total Crite	ria Score=	TS=3550°	<b>%</b>				
				Financi	al perspec	tive criteri	a/scores/	weights				
Criteria	F1	F2	F3	F4	F5	F6	F7	F8	F9			
$Sf_i$	70%	42.5%	70%	70%	18%	18%	63%	10%	18%			
$f_i$	0.020	0.012	0.020	0.020	0.005	0.005	0.018	0.003	0.005			
			Lea	rning and	Growth p	erspective	criteria/s	cores/weig	ghts			
Criteria	G1	G2	G3	G4	G5	G6	G7	G8	G9	G10	G11	G12
$Sg_i$	31%	31%	31%	31%	13%	24%	44%	202.5%	67%	242.5%	227.5%	50%
8i	0.009	0.009	0.009	0.009	0.004	0.007	0.012	0.057	0.019	0.068	0.064	0.014
Criteria	G13	G14	G15	G16	G17	G18	G19	G20	G21			
$Sg_i$	155.5%	119.5%	47.5%	87.5%	60%	10%	21%	21%	90%			
8i	0.044	0.034	0.013	0.025	0.017	0.003	0.006	0.006	0.025			

 Table 3. Cont.

				•	Total Crite	ria Score=	TS=3550%	o			·	
				Interr	al process	es criteria,	/scores/w	eights				
Criteria	P1	P2	P3	P4	P5	P6	P7	P8	P9	P10	P11	P12
$Sp_i$	52.5%	138.5%	131%	67%	88%	75%	33%	63%	57.5%	138%	100%	100%
$p_i$	0.015	0.039	0.037	0.019	0.025	0.021	0.009	0.018	0.016	0.039	0.028	0.028
Criteria	P13	P14	P15	P16	P17	P18	P19	P20	P21	P22	P23	
$Sp_i$	60%	80%	31%	16%	31%	16%	41%	10%	10%	50%	25%	
$p_i$	0.017	0.023	0.009	0.005	0.009	0.005	0.012	0.003	0.003	0.014	0.007	
				Custome	ers' perspe	ctive crite	ria/scores	/weights				
Criteria	E1	E2	ЕЗ	E4	E5							
$Se_i$	25%	10%	47.5%	10%	57.5%							
$e_i$	0.007	0.003	0.013	0.003	0.016							

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_		30.0%	30.0%	30.0%	7.5%	25%	40.0%	10.0%	20.0%	20.0%	5.0%	5.0%	10.0%	40.0%	40.0%	10.0%	50.0%	10.0%	40.0%	15.0%	21.0%		10.0%	18.0%			17.0%		11.0%	10.0%		
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**Figure 2.** The cross table between the standards' criteria of university ranking systems and Balanced Scorecard's (BSC) criteria of XYZ University.

## 4.3. Phase 3: Ranking the University Colleges (Alternatives)

The necessary information from six colleges (alternatives) was gathered to create the decision matrix, as illustrated before in step 3.1. Except for criteria F7, F9, and P3, which are minimized, all the other criteria are maximized. Appendix A shows the results obtained from steps 3.2 to 3.8. Tables A1 and A2 show the normalized and weighted normalized input data based on steps 3.2 and 3.3, respectively, using Equations (7)–(11). In Step 3.4, Equations (12) and (13) were applied to identify the best option (13). Subsequently, steps 3.5 and 3.6 used Equations (14)–(17) to define the decomposition of the optimal alternative and the decomposition of each of the alternatives. The findings of the decomposition are displayed in Tables A3 and A4. Equations (18)–(21) are used in Step 3.6 to calculate the magnitude of the best alternative and other alternatives. Table A5 displays the values that were obtained in this step. Steps 3.7a and 3.7b ranked the alternatives using Equations (22)–(27). The ranking using the alternate trace and median similarity methods is displayed in Tables A6 and A7. To implement the RATMI methodology, step 3.8 concentrates on the majority index between the alternative trace and median similarity methods utilizing Equation (28) with v = 0.5. Table 4 presents the findings.

	Alternative Trace	<b>Median Similarity</b>	<b>Majority Index</b>	
Alternative	$tr^* = 0.02057$ $tr^- = 0.02733$	$MS^* = 0.68978$ $MS^- = 0.92935$		Rank
	$tr_i$	$MS_i$	$E_i$	
A <sub>1</sub>	0.02339	0.78584	0.40856	4
$A_2$	0.02469	0.83322	0.60416	2
$A_3$	0.02445	0.83140	0.58221	3
$A_4$	0.02733	0.92935	1.00000	1
$A_5$	0.02216	0.74480	0.23207	5
$A_6$	0.02057	0.68978	0.00000	6

Table 4. Ranked alternatives using the Trace to Median Index (RATMI) method.

# 5. Discussion

The study's objective was attained by revealing the educational quality performance ranks of XYZ University colleges based on the combined set of criteria. This combination is achieved by mapping the international university ranking systems' standard criteria with the studied university strategic plan's BSC perspectives and its pertaining criteria. This mapping informed the weights of the criteria based on which the MCDM approach using the RATMI technique is conducted to find the performance ranking of the colleges. The findings of the study revealed that based on the quality criteria and their derived weightings, the ranking of the colleges in satisfying the criteria from most to least is as follows: engineering (A4), management (A2), technology (A3), architecture (A1), science (A5), and law (A6), respectively.

The RATMI technique is a technique for ranking the performance of different alternatives based on multiple criteria. Table 4 shows how the technique assigns quantitative scores to the alternatives based on their evaluation. The decision-maker can use these scores to make informed quality improvement decisions by identifying the colleges with lower rankings and the factors contributing to their lower scores. For example, if a college has a low score in a certain criterion, the decision-maker can work on improving that aspect to increase the college's overall ranking. Colleges should pay attention to the criteria that lowered their performance to increase their overall score and ranking. For instance, they could improve their ranking by (1) conducting a SWOT analysis of their strengths and weaknesses, (2) creating effective marketing and branding campaigns, (3) recruiting the best scholars, (4) ensuring quality standards through hiring committees, (5) offering new incentives to motivate staff to change their behavior, and (6) producing original research and making a positive impact on society.

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Developing a strategy map necessitates the involvement of a management board or a group of experts in the form of value assignments due to the nature of the strategy map demanding it. As a result, the reason for conducting this study is to evaluate the viability of using collective decision-making in real-world settings. The main difference between this study and those that came before is using the RATMI technique from the perspective of each BSC and comparing the results. The inferences of the research may be applied to short-term and long-term goals to improve the current situation at universities. Applying the proposed approach can help the decision-maker set more specific long- and short-term objectives for each evaluated college based on their performance ranking and by tracing back the criteria that caused their lower overall ranking score. This is because the study focused on defining each development criterion's most important indices. According to the findings of RATMI, cost control is the most important index from a financial point of view, product quality is the most important index from a customer point of view, and college finances and classroom material/experiences are the most important indices from an internal process point of view. Additionally, investment is the most important index from a learning and development point of view.

This study puts forward a novel strategic approach for universities to develop efficient strategies that enable achieving their educational quality objectives by unifying their efforts in satisfying the requirements of multiple international ranking systems while achieving their strategic goals concurrently and as per their priorities. Implications of this study also include informing university leaders and decision-makers on the most contributing colleges in achieving their strategic objectives and international rankings. Furthermore, it assists in pinpointing the quality shortcomings and their causes. This, in turn, will also help universities design more precise quality performance indicators and better allocate their resources to achieve educational excellence ultimately.

## 6. Conclusions

All higher education institutions endeavor for excellence in research, learning, teaching, and community engagement. Universities with a recognized reputation and a world ranking aim to develop strategic plans that attain such objectives. The issue stems from the lack of a comprehensive strategic framework that aligns the university's strategic objectives and criteria derived from a university strategic plan's BSC perspectives to the standards' criteria of international ranking systems. The existence of such a framework provides university decision-makers with the right tool for evaluating and realizing university educational quality objectives by consolidating their efforts in fulfilling the requirements of diverse worldwide ranking systems while achieving their strategic goals. This led to the research question: how can the higher education quality of university colleges be evaluated using criteria derived from the BSC's perspectives of its strategic plan and simultaneously using standard criteria of international ranking systems? As a response to the question, this study proposed a novel strategy for ranking university institutions in terms of educational quality. This is achieved via cross-mapping standard sets of criteria from multiple international university ranking systems and a university's strategic plan's BSC perspectives using an MCDM technique for the evaluation.

The proposed strategic framework is applied to six colleges of a non-profit university in the Middle East, exposing their performance rankings and contributions to fulfilling the university's educational quality objectives and the requirements of diverse worldwide ranking systems simultaneously.

The study's findings demonstrate the effectiveness of the proposed strategic framework and the effectiveness of the MCDM evaluation method used in achieving the desired benefit of apprising university leaders and decision-makers about the colleges that contribute the most to achieving their strategic objectives and worldwide designations. Furthermore, the study's findings show that the proposed methodology accurately identifies quality deficiencies and their causes. As a result, this will have the greatest influence on

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assisting universities in formulating more accurate performance metrics and efficiently allocating resources to attain educational excellence.

There are always limitations to any research study due to internal and external environmental considerations. Applying the proposed framework requires the availability of resources and skills to create and maintain high-quality ranking. Furthermore, data collection, analysis, verification, and dissemination processes are expensive and time-consuming, and they must be carried out rigorously and transparently. Moreover, university-ranking bodies require more significant funding that can be affected by global economic change. Additionally, evaluation alone cannot guarantee education quality, as it is primarily influenced by the commitment and alignment of all university academic and admin staff toward satisfying quality standards.

New assessment methods could be applied in future research to align criteria derived from BSC and standards criteria of international ranking systems. Furthermore, researchers may develop other methods for weighting the standards' criteria. This is for customized weightings that suit their universities' temporal and spatial contexts in terms of the type of university (i.e., public/private, profit/non-profit), size, resources, scientific degrees they offer, number of students, nature of scientific disciplines they teach, and location, to mention a few. Customized weightings of standards' criteria enable better suiting with their particular strategic goals and objectives and provide more insights into the better design of better-targeted education quality strategies.

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**Institutional Review Board Statement:** The Research Ethics Committee (REC) (National Committee of Bio-Ethics Registration Number: HA-02-J008) at the Unit of Biomedical Ethics, Faculty of Medicine, King Abdulaziz University granted a full ethical approval/exemption (Reference Number: 32-22) for the participants' consent and the collected information in this study.

Informed Consent Statement: Informed consent was obtained from all subjects involved in the study.

**Data Availability Statement:** The data presented in this study are available on request from the corresponding author. The data are not publicly available due to privacy and ethical restrictions.

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Conflicts of Interest: The authors declare no conflict of interest.

#### Appendix A

Appendix A depicts the complete calculation of the RATMI method. The calculation is presented based on the steps outlined in Section 3 (Steps 3.2 to 3.8).

 Table A1. Normalized decision-making matrix.

	F1	F2	F3	F4	F5	F6	F7	F8	F9	G1
Alternatives/Criteria	Max.	Max.	Max.	Max.	Max.	Max.	Min.	Max.	Min.	Max.
A1	0.8333	0.8182	0.6364	0.8000	0.7500	1.0000	0.7600	1.0000	0.5000	0.7692
A2	0.5833	0.6818	0.7727	0.7000	0.5000	0.8750	0.9500	1.0000	0.4000	0.6923
A3	0.6667	0.7273	0.7273	0.9000	0.5000	1.0000	0.4222	1.0000	0.6667	1.0000
A4	1.0000	1.0000	1.0000	1.0000	1.0000	0.8750	0.4750	1.0000	1.0000	0.9231
A5	0.2500	0.1818	0.2727	0.5000	0.4167	0.7500	0.8636	1.0000	0.4000	0.3846
A6	0.4167	0.4545	0.3636	0.6000	0.4167	0.6875	1.0000	1.0000	0.5000	0.3846
Alternatives/Criteria -	G2	G3	G4	G5	G6	G7	G8	G9	G10	G11
Anternatives/ Criteria	Max.									
A1	0.9412	0.9231	0.9615	0.8421	1.0000	0.2000	1.0000	0.5143	0.5000	1.0000
A2	1.0000	1.0000	1.0000	0.8947	1.0000	1.0000	1.0000	0.5714	0.7500	1.0000
A3	0.8824	1.0000	0.9615	0.9474	1.0000	1.0000	1.0000	0.8571	0.7500	1.0000
A4	0.9059	0.8462	0.8462	1.0000	1.0000	0.2000	1.0000	1.0000	1.0000	1.0000
A5	0.7647	0.8462	0.8077	0.7368	1.0000	0.8000	1.0000	0.3429	0.5000	1.0000
A6	0.7647	0.7692	0.8718	0.7895	1.0000	0.8000	1.0000	0.2857	0.2500	1.0000
Alternatives/Criteria -	G12	G13	G14	G15	G16	G17	G18	G19	G20	G21
Alternatives/ Criteria	Max.	Max.	Max.	Max.	Max.	Max.	Max	Max.	Max.	Max.
A1	0.8571	0.5714	1.0000	1.0000	0.8333	1.0000	1.0000	1.0000	1.0000	1.0000
A2	1.0000	0.7143	0.4000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000
A3	0.7619	0.7143	0.7000	1.0000	0.6667	1.0000	1.0000	1.0000	1.0000	1.0000
A4	0.9048	1.0000	0.4000	1.0000	0.8333	1.0000	1.0000	1.0000	1.0000	1.0000
A5	0.4762	0.8571	0.2000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000
A6	0.6190	0.2857	0.5000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000
A11	P1	P2	Р3	P4	P5	P6	P7	P8	P9	P10
Alternatives/Criteria -	Max.	Max.	Min.	Max.						
A1	1.0000	0.5000	0.5000	0.7500	1.0000	0.9474	0.3333	1.0000	1.0000	0.5714
A2	0.0001	1.0000	0.1667	0.5000	1.0000	1.0000	1.0000	1.0000	1.0000	0.4286
A3	0.5000	0.7500	0.1667	0.5000	1.0000	0.8421	1.0000	1.0000	1.0000	0.7143
A4	0.8000	1.0000	0.1667	1.0000	1.0000	0.8105	1.0000	1.0000	1.0000	1.0000
A5	0.0001	0.0000	1.0000	0.2500	1.0000	0.8000	0.1667	1.0000	1.0000	0.2857
A6	0.0001	0.0000	0.5000	0.2500	1.0000	0.8737	0.3333	1.0000	1.0000	0.4286
	P11	P12	P13	P14	P15	P16	P17	P18	P19	P20
Alternatives/Criteria -	Max.									
A1	0.4878	0.5556	0.7500	0.2927	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000
A2	0.8902	1.0000	0.5000	0.5122	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000
A3	0.8049	0.8704	1.0000	0.4634	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000
A4	1.0000	0.4259	0.7500	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000
A5	0.1220	0.5556	0.2500	0.0488	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000
A6	0.2683	0.5926	0.5000	0.1220	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000
	P21	P22	P23	E1	E2	E3	E4	E5		
Alternatives/Criteria -	Max.									
A1	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.6957	1.0000		
A2	1.0000	1.0000	1.0000	0.8000	0.6667	0.6000	0.2174	0.5000		
A3	1.0000	1.0000	1.0000	0.4000	0.6667	0.8000	0.4783	1.0000		
A4	1.0000	1.0000	1.0000	0.6000	1.0000	0.8000	1.0000	1.0000		
A5	1.0000	1.0000	1.0000	0.8000	0.0000	0.0000	0.0870	0.5000		
A6	1.0000	1.0000	1.0000	0.2000	0.0000	0.0000	0.0000	0.5000		

 Table A2. Weighted normalized decision-making matrix.

A11 12 10 12 1	F1	F2	F3	F4	F5	F6	F7	F8	F9	G1
Alternatives/Criteria	Max.	Max.	Max.	Max.	Max.	Max.	Min.	Max.	Min.	Max.
A1	0.0164	0.0098	0.0125	0.0158	0.0038	0.0051	0.0135	0.0028	0.0025	0.0067
A2	0.0115	0.0082	0.0152	0.0138	0.0025	0.0044	0.0169	0.0028	0.0020	0.0060
A3	0.0131	0.0087	0.0143	0.0177	0.0025	0.0051	0.0075	0.0028	0.0034	0.0087
A4	0.0197	0.0120	0.0197	0.0197	0.0051	0.0044	0.0084	0.0028	0.0051	0.0081
A5	0.0049	0.0022	0.0054	0.0099	0.0021	0.0038	0.0153	0.0028	0.0020	0.0034
A6	0.0082	0.0054	0.0072	0.0118	0.0021	0.0035	0.0177	0.0028	0.0025	0.0034
Alternatives/Criteria -	G2	G3	G4	G5	G6	G7	G8	G9	G10	G11
Alternatives/ Criteria	Max.	Max.	Max.	Max.	Max.	Max.	Max.	Max.	Max.	Max.
A1	0.0082	0.0081	0.0084	0.0031	0.0068	0.0025	0.0571	0.0097	0.0342	0.0641
A2	0.0087	0.0087	0.0087	0.0033	0.0068	0.0124	0.0571	0.0108	0.0512	0.0641
A3	0.0077	0.0087	0.0084	0.0035	0.0068	0.0124	0.0571	0.0162	0.0512	0.0641
A4	0.0079	0.0074	0.0074	0.0037	0.0068	0.0025	0.0571	0.0189	0.0683	0.0641
A5	0.0067	0.0074	0.0071	0.0027	0.0068	0.0099	0.0571	0.0065	0.0342	0.0641
A6	0.0067	0.0067	0.0076	0.0029	0.0068	0.0099	0.0571	0.0054	0.0171	0.0641
A1, (' /C'; '	G12	G13	G14	G15	G16	G17	G18	G19	G20	G21
Alternatives/Criteria -	Max.	Max.	Max.	Max.	Max.	Max.	Max	Max.	Max.	Max.
A1	0.0121	0.0250	0.0337	0.0134	0.0205	0.0169	0.0028	0.0059	0.0059	0.0254
A2	0.0141	0.0313	0.0135	0.0134	0.0247	0.0169	0.0028	0.0059	0.0059	0.0254
A3	0.0107	0.0313	0.0236	0.0134	0.0164	0.0169	0.0028	0.0059	0.0059	0.0254
A4	0.0127	0.0438	0.0135	0.0134	0.0205	0.0169	0.0028	0.0059	0.0059	0.0254
A5	0.0067	0.0376	0.0067	0.0134	0.0247	0.0169	0.0028	0.0059	0.0059	0.0254
A6	0.0087	0.0125	0.0168	0.0134	0.0247	0.0169	0.0028	0.0059	0.0059	0.0254
Alternatives/Criteria -	P1	P2	Р3	P4	P5	P6	P7	P8	P9	P10
Alternatives/ Criteria	Max.	Max.	Min.	Max.	Max.	Max.	Max.	Max.	Max.	Max.
A1	0.0148	0.0195	0.0185	0.0142	0.0248	0.0200	0.0031	0.0177	0.0162	0.0222
A2	0.0000	0.0390	0.0062	0.0094	0.0248	0.0211	0.0093	0.0177	0.0162	0.0167
A3	0.0074	0.0293	0.0062	0.0094	0.0248	0.0178	0.0093	0.0177	0.0162	0.0278
A4	0.0118	0.0390	0.0062	0.0189	0.0248	0.0171	0.0093	0.0177	0.0162	0.0389
A5	0.0000	0.0000	0.0369	0.0047	0.0248	0.0169	0.0015	0.0177	0.0162	0.0111
A6	0.0000	0.0000	0.0185	0.0047	0.0248	0.0185	0.0031	0.0177	0.0162	0.0167
	P11	P12	P13	P14	P15	P16	P17	P18	P19	P20
Alternatives/Criteria -	Max.	Max.	Max.	Max.	Max.	Max.	Max.	Max.	Max.	Max.
A1	0.0137	0.0157	0.0127	0.0066	0.0087	0.0045	0.0087	0.0045	0.0116	0.0028
A2	0.0251	0.0282	0.0085	0.0115	0.0087	0.0045	0.0087	0.0045	0.0116	0.0028
A3	0.0227	0.0245	0.0169	0.0104	0.0087	0.0045	0.0087	0.0045	0.0116	0.0028
A4	0.0282	0.0120	0.0127	0.0225	0.0087	0.0045	0.0087	0.0045	0.0116	0.0028
A5	0.0034	0.0157	0.0042	0.0011	0.0087	0.0045	0.0087	0.0045	0.0116	0.0028
A6	0.0076	0.0167	0.0042	0.0011	0.0087	0.0045	0.0087	0.0045	0.0116	0.0028
A1	P21	P22	P23	E1	E2	E3	E4	E5		
Alternatives/Criteria -	Max.	Max.	Max.	Max.	Max.	Max.	Max.	Max.		
A1	0.0028	0.0141	0.0070	0.0070	0.0028	0.0134	0.0020	0.0162		
A2	0.0028	0.0141	0.0070	0.0056	0.0019	0.0080	0.0006	0.0081		
A3	0.0028	0.0141	0.0070	0.0028	0.0019	0.0107	0.0013	0.0162		
A4	0.0028	0.0141	0.0070	0.0042	0.0028	0.0107	0.0028	0.0162		
A5										
	0.0028	0.0141	0.0070	0.0056	0.0000	0.0000	0.0002	0.0081		
A2 A3 A4	Max. 0.0028 0.0028 0.0028 0.0028	Max. 0.0141 0.0141 0.0141 0.0141	Max. 0.0070 0.0070 0.0070 0.0070	Max. 0.0070 0.0056 0.0028 0.0042	Max. 0.0028 0.0019 0.0019 0.0028	Max. 0.0134 0.0080 0.0107 0.0107	Max. 0.0020 0.0006 0.0013 0.0028	Max. 0.0162 0.0081 0.0162 0.0162		

 Table A3. Decomposition of the optimal alternative.

Optimal Alternative/Criteria	F1 Max.	F2 Max.	F3 Max.	F4 Max.	F5 Max.	F6 Max.	F7 Min.	F8 Max.	F9 Min.	G1 Max.
Alternative/Criteria	q1	q2	q3	q4	q5	q6	q7	q8	q9	q10
Q <sup>max</sup> Q <sup>min</sup>	0.0004	0.0001	0.0004	0.0004	0.0000	0.0000	0.0003	0.0000	0.0000	0.0001
	G2	G3	G4	G5	G6	G7	G8	G9	G10	G11
Optimal Alternative/Criteria	Max.									
	q11	q12	q13	q14	q15	q16	q17	q18	q19	q20
Q <sup>max</sup> Q <sup>min</sup>	0.0001	0.0001	0.0001	0.0000	0.0000	0.0002	0.0033	0.0004	0.0047	0.0041
	G12	G13	G14	G15	G16	G17	G18	G19	G20	G21
Optimal Alternative/Criteria	Max.	Max.	Max.	Max.	Max.	Max.	Max	Max.	Max.	Max.
internative, eriteria	q21	q22	q23	q24	q25	q26	q27	q28	q29	q30
Q <sup>max</sup> Q <sup>min</sup>	0.0002	0.0019	0.0011	0.0002	0.0006	0.0003	0.0000	0.0000	0.0000	0.0006
	P1	P2	Р3	P4	P5	P6	P7	P8	P9	P10
Optimal Alternative/Criteria	Max.	Max.	Min.	Max.						
	q31	q32	q33	q34	q35	q36	q37	q38	q39	q40
Q <sup>max</sup> Q <sup>min</sup>	0.0002	0.0015	0.0014	0.0004	0.0006	0.0004	0.0001	0.0003	0.0003	0.0015
	P11	P12	P13	P14	P15	P16	P17	P18	P19	P20
Optimal Alternative/Criteria	Max.									
	q41	q42	q43	q44	q45	q46	q47	q48	q49	q50
Q <sup>max</sup> Q <sup>min</sup>	0.0008	0.0008	0.0003	0.0005	0.0001	0.0000	0.0001	0.0000	0.0001	0.0000
	P21	P22	P23	E1	E2	E3	E4	E5		
Optimal Alternative/Criteria	Max.									
	q51	q52	q53	q54	q55	q56	q57	q58		
Q <sup>max</sup> Q <sup>min</sup>	0.0000	0.0002	0.0000	0.0000	0.0000	0.0002	0.0000	0.0003		

 Table A4. Decomposition of alternatives.

	<b>F1</b>	F2	F3	F4	F5	F6	F7	F8	F9	G1
Alternatives/Criteria	Max.	Max.	Max.	Max.	Max.	Max.	Min.	Max.	Min.	Max.
-	u1	u2	u3	u4	u5	u6	u7	u8	u9	u10
A <sub>1</sub> U <sup>max</sup>	0.00027	0.00010	0.00016	0.00025	0.00001	0.00003	-	0.00001	-	0.00005
$A_1U^{min}$	-	-	-	-	-	-	0.00018	-	0.00001	-
$A_2U^{max}$	0.00013	0.00007	0.00023	0.00019	0.00001	0.00002	-	0.00001	-	0.00004
$A_2U^{min}$	-	-	-	-	-	-	0.00028	-	0.00000	-
$A_3U^{max}$	0.00017	0.00008	0.00021	0.00032	0.00001	0.00003	-	0.00001	-	0.00008
$A_3U^{min}$	-	-	-	-	-	-	0.00006	-	0.00001	-
$A_4U^{max}$	0.00039	0.00014	0.00039	0.00039	0.00003	0.00002	-	0.00001	-	0.00006
$A_4U^{min}$	-	-	-	-	-	-	0.00007	-	0.00003	-
$A_5U^{max}$	0.00002	0.00000	0.00003	0.00010	0.00000	0.00001	-	0.00001	-	0.00001
$A_5U^{min}$	-	-	-	-	-	-	0.00023	-	0.00000	-
$A_6^{\circ}U^{max}$	0.00007	0.00003	0.00005	0.00014	0.00000	0.00001	-	0.00001	-	0.00001
$A_6U^{min}$	-	-	-	-	-	-	0.00032	-	0.00001	-

Table A4. Cont.

	G2	G3	G4	G5	G6	G7	G8	G9	G10	G11
Alternatives/Criteria	Max.	Max.	Max.	Max.	Max.	Max.	Max.	Max.	Max.	Max.
-	u11	u12	u13	u14	u15	u16	u17	u18	u19	u20
A <sub>1</sub> U <sup>max</sup> A <sub>1</sub> U <sup>min</sup>	0.00007	0.00006	0.00007	0.00001	0.00005	0.00001	0.00325	0.00009	0.00117	0.00411
$A_2U^{max}$ $A_2U^{min}$	0.00008	0.00008	0.00008	0.00001	0.00005	0.00015	0.00325	0.00012	0.00263	0.00411
A <sub>3</sub> U <sup>max</sup> A <sub>3</sub> U <sup>min</sup>	0.00006	0.00008	0.00007	0.00001	0.00005	0.00015	0.00325	0.00026	0.00263	0.00411
$A_4U^{max}$ $A_4U^{min}$	0.00006	0.00005	0.00005	0.00001	0.00005	0.00001	0.00325	0.00036	0.00467	0.00411
$A_5 U^{max}$ $A_5 U^{min}$	0.00004	0.00005	0.00005	0.00001	0.00005	0.00010	0.00325	0.00004	0.00117	0.00411
$A_6 U^{max}$ $A_6 U^{min}$	0.00004	0.00005	0.00006	0.00001	0.00005	0.00010	0.00325	0.00003	0.00029	0.00411
	G12	G13	G14	G15	G16	G17	G18	G19	G20	G21
Alternatives/Criteria	Max.	Max.	Max.	Max.	Max.	Max.	Max.	Max.	Max.	Max.
	u21	u22	u23	u24	u25	u26	u27	u28	u29	u30
A <sub>1</sub> U <sup>max</sup> A <sub>1</sub> U <sup>min</sup>	0.00015	0.00063	0.00113	0.00018	0.00042	0.00029	0.00001	0.00004	0.00004	0.00064
$A_2U^{max}$ $A_2U^{min}$	0.00020	0.00098	0.00018	0.00018	0.00061	0.00029	0.00001	0.00004	0.00004	0.00064
A <sub>3</sub> U <sup>max</sup> A <sub>3</sub> U <sup>min</sup>	0.00012	0.00098	0.00056	0.00018	0.00027	0.00029	0.00001	0.00004	0.00004	0.00064
$A_4U^{max}$ $A_4U^{min}$	0.00016	0.00192	0.00018	0.00018	0.00042	0.00029	0.00001	0.00004	0.00004	0.00064
$A_5 U^{max}$ $A_5 U^{min}$	0.00004	0.00141	0.00005	0.00018	0.00061	0.00029	0.00001	0.00004	0.00004	0.00064
$A_6 U^{max}$ $A_6 U^{min}$	0.00008	0.00016	0.00028	0.00018	0.00061	0.00029	0.00001	0.00004	0.00004	0.00064
	P1	P2	Р3	P4	P5	P6	P7	P8	P9	P10
Alternatives/Criteria	Max.	Max.	Min.	Max.	Max.	Max.	Max.	Max.	Max.	Max.
	u31	u33	u33	u34	u35	u36	u37	u38	u39	u40
A <sub>1</sub> U <sup>max</sup>	0.00022	0.00038	- 0.0024	0.00020	0.00061	0.00040	0.00001	0.00032	0.00026	0.00049
A <sub>1</sub> U <sup>min</sup> A <sub>3</sub> U <sup>max</sup>	0.00000	0.00152	0.00034	0.00009	0.00061	0.00045	0.00009	0.00032	0.00026	0.00028
A <sub>3</sub> U <sup>min</sup> A <sub>3</sub> U <sup>max</sup>	0.00005	0.00086	0.00004	0.00009	0.00061	0.00032	0.00009	0.00032	0.00026	0.00077
$A_3 U^{min} \ A_4 U^{max}$	0.00014	0.00152	0.00004	0.00036	0.00061	0.00029	0.00009	0.00032	0.00026	0.00151
$A_4U^{min}$ $A_5U^{max}$	0.00000	0.00000	0.00004	0.00002	0.00061	0.00029	0.00000	0.00032	0.00026	0.00012
$A_5 U^{min} A_6 U^{max}$	-	-	0.00136	-	-	-	- 0.00001	0.00032	0.00026	0.00028
1160	0.00000	0.00000	_	0.00002	0.00061	0.00034	() ()()()() (		0.00020	-
$A_6U^{min}$	0.00000	0.00000	0.00034	0.00002	0.00061	0.00034	0.00001	-	-	
$ m A_6 U^{min}$									- P19	P20
A <sub>6</sub> U <sup>min</sup> Alternatives/Criteria	-	-	0.00034	-	-	-	-	-		
A <sub>6</sub> U <sup>min</sup>	- P11	- P12	0.00034 P13	- P14	- P15	- P16	- P17	- P18	P19	P20
$A_6 U^{min}$ Alternatives/Criteria $A_1 U^{max}$	P11 Max.	P12 Max.	0.00034 P13 Max.	P14 Max.	P15 Max.	P16 Max.	P17 Max.	P18 Max.	P19 Max.	P20 Max.
A <sub>6</sub> U <sup>min</sup> Alternatives/Criteria  A <sub>1</sub> U <sup>max</sup> A <sub>1</sub> U <sup>min</sup> A <sub>3</sub> U <sup>max</sup>	P11 Max. u41 0.00019 - 0.00063	P12 Max. u42 0.00024 - 0.00079	0.00034 P13 Max. u43 0.00016 - 0.00007	- P14 Max. u44	P15 Max. u45 0.00008	P16 Max. u46 0.00002	P17 Max. u47 0.00008 - 0.00008	P18 Max. u48 0.00002 - 0.00002	P19 Max. u49	P20 Max. u50 0.00001
A <sub>6</sub> U <sup>min</sup> Alternatives/Criteria  A <sub>1</sub> U <sup>max</sup> A <sub>1</sub> U <sup>min</sup> A <sub>3</sub> U <sup>min</sup> A <sub>3</sub> U <sup>min</sup> A <sub>3</sub> U <sup>min</sup> A <sub>3</sub> U <sup>max</sup>	P11 Max. u41 0.00019	P12 Max. u42 0.00024	0.00034 P13 Max. u43 0.00016 - 0.00007 - 0.00029	P14 Max. u44 0.00004	P15 Max. u45 0.00008 - 0.00008 - 0.00008	P16 Max. u46 0.00002 - 0.00002 - 0.00002	P17 Max. u47 0.00008	P18 Max. u48 0.00002 - 0.00002 - 0.00002	P19 Max. u49 0.00013	P20 Max. u50 0.00001 - 0.00001 - 0.00001
A <sub>6</sub> U <sup>min</sup> Alternatives/Criteria  A <sub>1</sub> U <sup>max</sup> A <sub>1</sub> U <sup>min</sup> A <sub>3</sub> U <sup>min</sup> A <sub>4</sub> U <sup>max</sup>	P11 Max. u41 0.00019 - 0.00063 - 0.00051 - 0.00079	P12 Max. u42 0.00024 - 0.00079	0.00034 P13 Max. u43 0.00016 - 0.00007	P14 Max. u44 0.00004 - 0.00013	P15 Max. u45 0.00008 - 0.00008	P16 Max. u46 0.00002 - 0.00002	P17 Max. u47 0.00008 - 0.00008	P18 Max. u48 0.00002 - 0.00002	P19 Max. u49 0.00013 - 0.00013	P20 Max. u50 0.00001 - 0.00001
A <sub>6</sub> U <sup>min</sup> Alternatives/Criteria  A <sub>1</sub> U <sup>max</sup> A <sub>1</sub> U <sup>min</sup> A <sub>3</sub> U <sup>min</sup>	P11 Max. u41 0.00019 - 0.00063 - 0.00051	P12 Max. u42 0.00024 - 0.00079 - 0.00060	0.00034 P13 Max. u43 0.00016 - 0.00007 - 0.00029	P14 Max. u44 0.00004 - 0.00013 - 0.00011	P15 Max. u45 0.00008 - 0.00008 - 0.00008	P16 Max. u46 0.00002 - 0.00002 - 0.00002	P17 Max. u47 0.00008 - 0.00008 - 0.00008	P18 Max. u48 0.00002 - 0.00002 - 0.00002	P19 Max. u49 0.00013 - 0.00013	P20 Max. u50 0.00001 - 0.00001 - 0.00001

Table A4. Cont.

	P21	P22	P23	E1	E2	Е3	E4	E5
Alternatives/Criteria	Max.							
-	u51	u52	u53	u54	u55	u56	u57	u58
A <sub>1</sub> U <sup>max</sup>	0.00001	0.00020	0.00005	0.00005	0.00001	0.00018	0.00000	0.00026
$\mathrm{A_1}\mathrm{U^{min}}$	-	-	-	-	-	-	-	-
$A_3U^{max}$	0.00001	0.00020	0.00005	0.00003	0.00000	0.00006	0.00000	0.00007
$A_3U^{min}$	-	-	-	-	-	-	-	-
$A_3U^{max}$	0.00001	0.00020	0.00005	0.00001	0.00000	0.00011	0.00000	0.00026
$A_3U^{min}$	-	-	-	-	-	-	-	-
$A_4U^{max}$	0.00001	0.00020	0.00005	0.00002	0.00001	0.00011	0.00001	0.00026
$\mathrm{A_4U^{min}}$	-	-	-	-	-	-	-	-
$A_5U^{max}$	0.00001	0.00020	0.00005	0.00003	0.00000	0.00000	0.00000	0.00007
$A_5U^{min}$	-	-	-	-	-	-	-	-
$A_6U^{max}$	0.00001	0.00020	0.00005	0.00000	0.00000	0.00000	0.00000	0.00007
$A_6^{o}U^{min}$	-	-	-	-	-	-	-	-

**Table A5.** The magnitude of optimal alternatives.

	Max.	Min.		
Alternative/Q _	$Q_k$	Q <sub>h</sub> 0.04127		
michanive/Q =	0.16772			
_	$U_{ik}$	U <sub>ih</sub>		
$A_1$	0.13377	0.02300		
$A_2$	0.14278	0.01806		
$\overline{A_3}$	0.14324	0.01027		
$A_4$	0.16010	0.01160		
$A_5$	0.12226	0.04001		
$A_6$	0.11633	0.02573		

 $\textbf{Table A6.} \ \ \textbf{Alternatives ranked according to the alternative trace method.}$ 

Alternative	Trace	Value	Rank
$A_1$	$tr(T_1)$	0.02339	4
$A_2$	$tr(T_2)$	0.02469	2
$A_3$	$tr(T_3)$	0.02445	3
$A_4$	$tr(T_4)$	0.02733	1
$A_5$	$tr(T_5)$	0.02216	5
$A_6$	$tr(T_6)$	0.02057	6

 $\textbf{Table A7.} \ \text{Alternatives ranked according to the median similarity method.}$ 

	Max.	Min.	Median	Perimeter Similarity	
Alternative	$Q_k$	$Q_h$	M		Rank
	0.16772	0.04127	0.08636	$MS_i = M_i/M$	
_	$U_{ik}$	$U_{ih}$	$M_i$	_	
$A_1$	0.13377	0.02300	0.06787	0.78584	4
$A_2$	0.14278	0.01806	0.07196	0.83322	2
$A_3$	0.14324	0.01027	0.07180	0.83140	3
$A_4$	0.16010	0.01160	0.08026	0.92935	1
$A_5$	0.12226	0.04001	0.06432	0.74480	5
$A_6$	0.11633	0.02573	0.05957	0.68978	6

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