Contents lists available at GrowingScience

## Journal of Future Sustainability

homepage: www.GrowingScience.com/jfs

## Greening the pillars of pharmaceuticals: Sustainable supplier selection in emerging economies

# M.M Fahim Siddiquee<sup>a\*</sup>, Pritom Kumar Shaha<sup>a</sup> and Ahsan Akhtar Hasin<sup>a</sup>

| <sup>a</sup> Department of Industrial & | oduction Engineering, Bangladesh University of Engineering and Technology, Dhaka, Bangladesh | h |
|---|--|---|
| CHRONICLE                               | A B S T R A C T  |   |

| Article history:<br>Received: March 4, 2023<br>Received in revised format:<br>March 28, 2023<br>Accepted: September 14, 2023<br>Available online:<br>September 14, 2023<br>Keywords: | The pharmaceutical industry is vital for global health, supplying necessary medicines, yet its conventional supply chain has notable environmental and social impacts. Amid a growing sustainability focus across sectors, the pharmaceutical industry must also adopt sustainable practices throughout its supply chain. This includes lessening its ecological impact, curbing waste, and endorsing social responsibility. Assessing a supplier's environmental performance, or "green performance," is of great interest. This involves gauging their eco-friendly actions like energy efficiency, waste management, and carbon footprint reduction. Metrics cover certifica-  |
|--|---|
| Green Supply Chain<br>Supplier Evaluation<br>MCDM<br>TOPSIS<br>Sustainability  | tions, resource conservation, and responsible sourcing. In a study within a renowned Bangla-<br>deshi pharmaceutical firm, a key drugs manufacturer, seven criteria were used to evaluate sup-<br>pliers' green performance. For this multi-criteria decision-making (MCDM) task, the Technique<br>for Order of Preference by Similarity to Ideal Solution (TOPSIS) was applied, considering a<br>fuzzy environment. It ranked alternative suppliers via a widely used approach using linguistic<br>terms expressed as Triangular Fuzzy Numbers (TFN). Important weights were determined via<br>the Center of Area (COA) method. The study revealed supplier 4 as the top performer in green<br>performance among five alternatives. This study introduces an innovative strategy for manufac-<br>turing decision-makers to choose the most suitable green supplier. It's anticipated to aid deci-<br>sion-makers in emerging economy pharmaceutical industries, facilitating the efficient evalua-<br>tion of economically viable and environmentally sustainable suppliers for the long term. |

© 2024 by the authors; licensee Growing Science, Canada.

### 1. Introduction

The intricate coordination of pharmaceutical product production, distribution, and delivery to end consumers takes place within a multilayered nexus made up of a wide range of stakeholders, including people, groups, and businesses, which is referred to as the pharmaceutical supply chain collectively. The pharmaceutical industry has seen significant development and upheaval in recent years, because of advances in technology, globalization, and shifting consumer needs. But these advancements also bring with them new difficulties and complications in the pharmaceutical supply chain. The preservation and traceability of pharmaceutical products have received increasing attention in recent years. The hazards of counterfeit medicine treatments to patient health have grown significantly, and they are now a significant issue. The COVID-19 pandemic has brought to light the pharmaceutical supply chain's vulnerabilities. Worldwide transportation disruptions, an increase in the demand for certain pharmaceuticals, and delivery chain bottlenecks have all brought attention to the need for more resilience and flexibility. For organizations to be successful and provide high-quality products with efficient supply chains, it is essential to evaluate suppliers' performance.

Supply Chain Environmental Management (SCEM), also known as Green Supply Chain Management (GSCM), is a widely accepted practice by the business world that entails keeping an eye on suppliers' environmental performance. Conscious business practices, however, are attracting more and more attention. Businesses are thinking more and more about incorporating ecological practices into their policy designs (Ashraf et al., 2020). Due to its significant impact on supply chain performance and firm competitiveness, academics are becoming more and more interested in investigating supplier perfor-

\* Corresponding author. E-mail address: <u>fahim.ipe.2018@gmail.com</u> (M.M Fahim Siddiquee)

ISSN 2816-8151 (Online) - ISSN 2816-8143 (Print) © 2024 by the authors; licensee Growing Science, Canada doi: 10.5267/j.jfs.2024.9.001 mance evaluation (Chang et al., 2011). Aspects of the green supply chain such eco-design, green distribution, eco-purchasing, eco-manufacturing, and eco-reverse logistics have an influence on the sustainability of pharmaceutical manufacture (Al-Awamleh et al., 2022). Due to the increasing awareness and understanding of environmental concerns throughout the world, the pharmaceutical industry has also been compelled to utilize GSCM. Upgrades to facilities are necessary for pharmaceutical businesses in particular in order to develop and execute GSCM through the Green Manufacturing Process. Businesses are pushed to implement environmentally conscious supply chain practices as a result of increasing governmental and international demand to protect ecological integrity. The broad adoption of these environmentally conscious practices is plain to see in the industrial sectors of industrialized countries. Multiple industrialized economies are under pressure to adopt environmentally friendly industrial practices. There is also a worldwide research initiative focusing on a wide range of supply chain sustainability aspects, all with the goal of enhancing environmental sustainability.

Due to the simultaneous examination of several criteria and objectives, the Multicriteria choice Making technique (MCDM) is an essential instrument for solving choice problems. By using a weighting procedure inside the present choices via pairwise comparisons, multicriteria decision making approaches based on linguistic evaluations aid in producing the optimal choice decision (Kabir and Hasin, 2011). Evaluation of a supplier taking into account environmental and economic implications is regarded as a significant multi-criteria decision-making (MCDM) challenge. Undertaking the fact that the suppliers effectively incorporated green criteria, MCDM approaches are successful in treating the issue (Remadi & Frikha, 2020). A multi-criterion, intricate supply chain challenge is supplier selection. To choose the most favorable option from a group of selected alternatives, MCDM methods—which are widely used in supplier selection—evaluate the alternatives based on many features. (Rashidi and Cullinane, 2019).

Both organic and inorganic chemicals are essential to the pharmaceutical production process and have a key function to play. It is crucial to always have a sustainability mindset, especially when choosing suppliers, in order to reduce the harmful impacts of these chemicals and ensure proper disposal of the hazardous and chemically active waste created by pharmaceutical enterprises. There has been a noticeable lack of research on sustainable supplier selection using Multiple Criteria Decision Making (MCDM) methods within this industry, despite the significant growth of the pharmaceutical sector in Bangladesh and the presence of about 257 licensed pharmaceutical companies currently in operation. To make up this void, this study tried to answer the stated research questions (RQs):

**RQ1:** What pertinent assessment factors must be considered while evaluating the performance of suppliers by Bangladeshi pharmaceutical companies?

RQ2: What weight does each of the chosen assessment criteria provide to the performance of green suppliers?

#### 2. Literature review

For this research, a well-organized literature review on sustainable supplier performance evaluation and MCDM approaches was conducted. Given that Bangladesh's pharmaceutical sector has never been the subject of study in this field, it is challenging to find adequate standards for this business. So, a thorough literature review was used to conduct the study. Here, a review of the literature on MCDM methods is provided before a review of the literature on criterion selection.

Given its significant influence on the quality and timeliness of the goods and services they offer, supplier assessment is today's top priority for any manufacturing or service organization (Rahman et al., 2022). The traditional methods of selecting a supplier frequently depend on the advertised price, which frequently overlooks significant direct and indirect costs related to the quality, delivery, and service costs of acquired products. Nevertheless, uncertainty always exists because the future cannot be predicted with absolute certainty (Badi and Ballem, 2018).

The best green supplier might be chosen using a cutting-edge group decision-making method built on features of Industry 4.0. AHP and TOPSIS processes are combined in a Pythagorean fuzzy environment by Çalık (2021). The Pythagorean Fuzzy AHP interval-valued approach has been used in this specific situation to get the criteria weights. Pythagorean Fuzzy TOPSIS is then used to rank and evaluate the different suppliers, making it easier to choose the best one based on supplier distances. Rahman et al. (2022) developed a MCDM model to find sustainable suppliers for textile dying, which consumes the most chemicals in Bangladesh. They created an integrated approach that utilized the SWARA-WASPAS method to find sustainable suppliers. The complete approach proposed by Abdel-Baset et al. (2019) was used to identify sustainable suppliers in the import sector.

Their objective was to calculate key measurements for the import field and provide a fair and reliable forecast. Summarized studies are presented in Table 1.

In this study, the assessment and ranking of providers were accomplished through the implementation of the TOPSIS approach within a fuzzy framework. At the heart of TOPSIS lies the fundamental principle that the optimal choice should be the one closest to the ideal solution while simultaneously being farthest from the anti-ideal solution (Opricovic and Tzeng, 2004). The Centre of Area (COA) approach was employed to calculate the weight of the criterion. Experts in COA can indicate the importance of each criterion in respect to other, more weighted considerations.

Environmental parameters must be incorporated into traditional supplier selection practices for organizations wishing to develop green supply chain management.

| Summary of Studies on Supplie | er's Performance Evaluation |  |
|-------------------------------|-----------------------------|--|
| Author (Year)                 | Focused Industry            | Method                                     |
| Çalık (2021)                  | Industry 4.0                | Pythagorean fuzzy AHP and fuzzy TOPSIS     |
| Rahman et al. (2022)          | Textile Dyeing              | SWARA-WASPAS integrated method             |
| Thanh and Lan (2022)          | Food-processing industry    | Hybrid SWOC-FAHP-WASPAS                    |
| Abdel-Baset et al. (2019)     | Importing Field             | Integrated neuromorphic ANP and VIKOR      |
| Tian et al. (2018)            | Agri-food industry          | Intuitionistic Fuzzy TOPSIS and Best-Worst |
| Pamucar et al. (2022)         | Health sector               | MACBETH                                    |
| Remadi and Frikha (2020)      | Pharmaceuticals             | Intuitionistic Fuzzy Set FlowSort          |

Green manufacturing has become a crucial concern for practically every company due to the increased global awareness of environmental preservation, and it will ultimately decide a factory's long-term viability. To assess whether suppliers are qualified to work with the company, a performance evaluation methodology for green suppliers is thus required (Lee et al., 2009). As consumers' knowledge of the environment grows, manufacturers are starting to take it into account when evaluating and choosing suppliers (Guo et al., 2017).

## Table 2

Table 1

Criteria Used in Recent Studies

| Puška and<br>Stoja-<br>nović<br>(2022) | <ul> <li>✓ Material Cost</li> </ul> | Transportation Cost | Payment Terms | QMS | Quality Assurance | Process Improvement | <ul> <li>▲ Lead Time</li> </ul> | Responsiveness | Flexibility | On Time | Green Design | ✓ Green Purchasing | Green Packaging | EMS | Waste Management | Recycle | Pollution Control | <ul> <li>Emission Control</li> </ul> | <ul> <li>Management Commitment</li> </ul> |
|--|-------------------------------------|---------------------|---------------|-----|-------------------|---------------------|---------------------------------|----------------|-------------|---------|--------------|--------------------|-----------------|-----|------------------|---------|-------------------|--------------------------------------|---|
| Salimian<br>et al.<br>(2022)           | V                                   |                     |               | V   |                   |                     |                                 |                |             | 1       |              |                    |                 | ~   |                  |         | ~                 |                                      | V   |
| Çalık<br>(2021)                        |                                     |                     |               |     | ~                 |                     |                                 |                | √           | ~       | ~            |                    |                 | ~   |                  |         | √                 |                                      |   |
| Remadi<br>and<br>Frikha<br>(2020)      | 1                                   |                     |               | 1   |                   |                     |                                 |                |             | 1       |              | ~                  |                 |     |                  | 1       |                   |                                      | √   |
| Baset et al. (2019)                    | ~                                   | ~                   |               |     |                   |                     |                                 |                |             |         | ~            |                    | √               |     | ~                |         |                   |                                      |   |

### 3. Methodology and Data Collection

### 3.1 Fuzzy set

A mathematical idea known as fuzzy set theory enables the representation and manipulation of ambiguity and uncertainty in data. L. A. Zadeh introduced Fuzzy set (FS) theory, was developed on the presumption that phonetic phrases from the fuzzy set, rather than numbers, are the primary components of human perception and judgement. The degree of an element in FS theory can take any value between 0 and 1, where 0 represents total non-membership and 1 represents entire membership. Numerous applications, such as artificial intelligence, control systems, decision-making, and pattern recognition, employ fuzzy sets.

**Definition 1.** (Fuzzy number): In the context of this study, Fuzzy Numbers (FNs) are used to assess the suppliers to Green Supply Chain Management (GSCM) implementation. FNs are a type of Fuzzy Set (FS) that are easy to understand and use

for decision makers. A standard representation of a Triangular Fuzzy Number (TFN) takes the form (l, m, u), where l represents the lower limit, m is the most probable value, and u stands for the upper limit. Figure 1 illustrates that a TFN exhibits linear illustration on both its left and right sides. The mathematical expression for the membership function of a TFN can be defined as Eq. (1).

$$\mu(z/M) = \begin{cases} 0, & z \le 1 \\ \frac{z - 1}{m - 1}, & 1 \le z \le m \\ \frac{u - z}{u - m}, & m \le z \le u \\ 0, & z \ge u \end{cases}$$
(1)

Fig. 1. Triangular Fuzzy Distribution

The easiest way to determine a fuzzy number is to compare the left and right representations of each membership level as shown in Eq. (2):

$$\overline{M} = \overline{M}^{l(y)}, \overline{M}^{r(y)} = (l + (m - l)y, u + (m - u)y), y \in [0, 1]$$
<sup>(2)</sup>

**Definition 2:** Let A(l, m, u)and B(o, p, q) are two TFNs (see Figure 2). Fuzzy numbers A and B's distance from each other is calculated as:

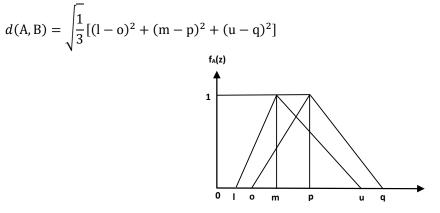


Fig. 2. Two Triangular Fuzzy Numbers

**Definition 3:** Suppose there are K evaluators in a group of decision-makers. A positive TFN may be used to indicate the fuzzy rating of the evaluator  $D_k$ , where k can be denoted by the values 1, 2,..., K  $R_k$  (k = 1, 2, ..., K) along with membership function  $FR_k(z)$ . The combined fuzzy rating or aggregated fuzzy value may thus be described as follows:

 $\mathbf{R}=(\mathbf{l},\mathbf{m},\mathbf{u})$ 

Here,

k= 1,2, 3, ...k

$$l = \min_{k} \{l_{k}\}, \qquad m = 1/k \sum_{k=1}^{b} m_{k}, \qquad u = \max_{k} \{u_{k}\}_{k}.$$
(3)

#### 3.2 Center of Area (COA) Method for Defuzzufied Value Calculation

To obtain a precise, non-fuzzy number for each criterion, the information in the fuzzy decision matrices is defuzzified. The value that best captures the ideal non-fuzzy performance (BNP) was determined in the context of this study using a sophisticated defuzzification approach. There are, in general, three main methods for calculating BNP: the mean of maximum (MOM), the center of area (COA), and the alpha-cut approach. The COA technique stands out among them as a particularly tasteful and useful option for actual applications. Notably, the COA approach adds an added layer of speed and convenience to the process by eliminating the need for assessors to participate in complex procedural evaluations. COA methods of TFN performance score  $\bar{h}_{ai} = (lh_{ai}, mh_{ai}, uh_{ai})$  may be used to determine the 'BNP' value, and the supplied equation is utilized to do so. The 'BNP' value can be expressed as,

BNP: 
$$x_{ai} = lh_{ai} + \frac{(uh_{ai} - lh_{ai}) + (mh_{ai} - lh_{ai})}{3}, \forall a$$
 (4)

#### 3.3 TOPSIS Method

A well-known multi-criteria decision-making (MCDM) technique called Technique for Order of Preference by Similarity to Ideal Solution (TOPSIS) is used to rank solutions only based on a few criteria. It involves a scientific procedure where options are contrasted with the best-case scenario and the worst-case scenario. To establish how near or far off each alternative is from the ideal solution and the worst-case scenario, TOPSIS computes their similarity. The technique makes a thorough evaluation by considering both the excellent and bad components of each criterion. The fundamental rule is that the alternative that is ultimately picked should be the one that is closest to the perfect solution and the furthest from the opposite of the ideal solution. (Opricovic and Tzeng, 2004).

Steps of TOPSIS are retrieved from Papathanasiou et al. (2018).

Step 1: Determine the normalized decision matrix. The calculation of the normalized value, denoted as  $r_{ij}$  is performed as follows:

$$r_{ij} = \frac{x_{ij}}{\sqrt{\sum_{i=1}^{m} x_{ij}^2}} \quad \text{where, } i = 1, 2, ..., m \text{ and } j = 1, 2, ..., n.$$
(5)

Step 2: Calculate the weighted normalized decision matrix. The weighted normalized value  $V_{ij}$  is calculated as follows:

$$V_{ij} = r_{ij} * W_j$$
 where, i =1, 2, ..., m and j = 1, 2, ..., n. (6)

 $W_j$  is the weight of the j<sup>th</sup> criterion or attribute and  $\sum_{j=1}^{n} W_j = 1$ .

**Step 3**: Calculate the ideal  $(A^*)$  and negative ideal  $(A^-)$  solutions which will be used in next step.

$$A^* = \{(\max_i V_{ij} | j \in C_b), (\min_i V_{ij} | j \in C_c)\} = \{V_j^* | j = 1, 2, ..., m\}$$
(7)

$$A^{-} = \{(\min_{i} V_{ij} | j \in C_{b}), (\max_{i} V_{ij} | j \in C_{c})\} = \{V_{j}^{-} | j = 1, 2, ..., m\}$$
(8)

**Step 4:** Compute the separation metrics employing the m-dimensional Euclidean distance. The separation metrics for each option from both the positive ideal solution and the negative ideal solution are outlined below:

$$S_i^* = \sqrt{\sum_{j=1}^m (v_{ij} - v_j^*)^2}$$
(9)

$$S_i^- = \sqrt{\sum_{j=1}^m (v_{ij} - v_j^-)^2}$$
(10)

**Step 5:** Compute the relative closeness to the ideal solution. The relative closeness of the alternative  $A_i$  concerning A\* is defined in the subsequent manner:

$$RC_i^* = \frac{s_i^-}{s_i^* + s_i^-}, i = 1, 2, \dots, m$$
(11)

# Step 6: Rank the alternatives in order.

## 3.4 Data collection

In this study Alternative Suppliers are detonated as A1, A2.....A5 (Total five alternative suppliers), Experts are denoted as E1, E2, E3, E4 (Total four experts who gave importance rating), Decision Makers are denoted as D1, D2, D3 (Total three decision Makers who rate the alternative supplier's performance).

# Table 3

| Information about Expert and Decision Maker |                                   |
|---|-----------------------------------|
| Expert/Decision Maker                       | Designation                       |
| E1  | Head of Supply Chain              |
| E2  | Executive                         |
| E3  | Production & Development Engineer |
| E4  | Researcher                        |
| D1  | Senior Officer                    |
| D2  | Senior Assistant Manager          |
| D3  | Senior Assistant Manager          |

Two types of scale have been used for this study. Scale shown in Table 4 is for Experts who gave the importance for the selected criteria and scale shown in Table 5 used by Decision Makers for performance rating purpose. In Table 6 selected criteria for green supplier's performance evaluation in pharmaceutical company is presented.

| Table 4                   |                          | Table 5                 |                               |
|---------------------------|--------------------------|-------------------------|-------------------------------|
| Scale for Experts to Give | Importance Rating        | Scale for Decision Make | rs to Give Performance Rating |
| Linguistic Variables      | Triangular Fuzzy Numbers | Linguistic Variables    | Triangular Fuzzy Numbers      |
| Very Low (VL)             | (0,0,0.1)                | Very Poor (VP)          | (0,0.1,0.2)                   |
| Low (L)                   | (0.1,0.2,0.3)            | Poor (P)                | (0.1,0.2,0.3)                 |
| Medium Low (ML)           | (0.2,0.3,0.4)            | Medium Poor (MP)        | (0.2,0.3,0.4)                 |
| Medium(M)                 | (0.4,0.5,0.6)            | Medium(M)               | (0.3,0.4,0.5)                 |
| Medium High (MH)          | (0.6, 0.7, 0.8)          | Medium Good (MG)        | (0.5,0.6,0.7)                 |
| High(H)                   | (0.7,0.8,0.9)            | Good(G)                 | (0.6,0.7,0.8)                 |
| Very High                 | (0.8,0.9,1)              | Very Good (VG)          | (0.7,0.8,0.9)                 |
|                           |                          | Excellent               | (0.8,0.9,1)                   |

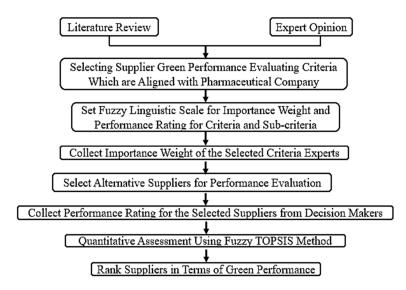


Fig. 3. Proposed Methodology

Evaluating a company entails examining its economic viability, devotion to quality, timely delivery, good after-sales service, eco-friendly practices, environmental responsibility, and strategic alliances, all of which contribute to its overall success.

| Table 6         |                        | Table 7        |              |     |     |     |
|-----------------|------------------------|----------------|--------------|-----|-----|-----|
| Selected Criter | ria for this Study     | Expert's Impor | tance Rating | g   |     |     |
|                 | Criteria               | Criteria       | E-1          | E-2 | E-3 | E-4 |
| C1              | Economic Factors       | C1             | Н            | Н   | Н   | VH  |
| C2              | Quality Concern        | C2             | VH           | Μ   | Н   | MH  |
| C3              | Delivery               | C3             | Н            | ML  | VH  | MH  |
| C4              | After Sales Service    | C4             | VH           | MH  | MH  | MH  |
| C5              | Green Management       | C5             | MH           | MH  | Н   | М   |
| C6              | Environment Management | C6             | Н            | MH  | Н   | М   |
| C7              | Strategic Alliance     | C7             | VH           | ML  | L   | М   |

Table 7 presents the expert's importance rating for each criterion. Experts gave ratings using Table 4. Linguistic Values were changed by TFN for quantitative analysis which is shown in Table 10. Decision Makers used Table 5 linguistic scale for performance rating, shown in Table 8. Table 9 presents the TFNs for the linguistic value.

### Table 8

### Decision Maker's Performance Rating

|    |         |    | From | n D1 |    |    |    |  |  |  |  |
|----|---------|----|------|------|----|----|----|--|--|--|--|
|    | C1      | C2 | C3   | C4   | C5 | C6 | C7 |  |  |  |  |
| A1 | G       | М  | G    | G    | VP | М  | М  |  |  |  |  |
| A2 | G       | VG | VG   | VG   | VP | G  | VG |  |  |  |  |
| A3 | М       | М  | VP   | Р    | VP | М  | MP |  |  |  |  |
| A4 | G       | G  | VG   | VG   | VP | MG | VG |  |  |  |  |
| A5 | М       | MG | MP   | М    | VP | М  | G  |  |  |  |  |
|    | From D2 |    |      |      |    |    |    |  |  |  |  |
|    | C1      | C2 | C3   | C4   | C5 | C6 | C7 |  |  |  |  |
| A1 | М       | М  | MG   | G    | Р  | М  | VG |  |  |  |  |
| A2 | G       | MG | MG   | G    | Р  | М  | VG |  |  |  |  |
| A3 | Р       | М  | М    | М    | Р  | Р  | М  |  |  |  |  |
| A4 | VG      | G  | VG   | G    | Р  | М  | E  |  |  |  |  |
| A5 | М       | MG | М    | G    | Р  | Р  | G  |  |  |  |  |
|    |         |    | From | n D3 |    |    |    |  |  |  |  |
|    | C1      | C2 | C3   | C4   | C5 | C6 | C7 |  |  |  |  |
| A1 | G       | М  | MG   | Р    | VP | MP | G  |  |  |  |  |
| A2 | VG      | G  | G    | VG   | VP | MP | VG |  |  |  |  |
| A3 | М       | MP | Р    | Р    | VP | Р  | Р  |  |  |  |  |
| A4 | G       | VG | VG   | VG   | VP | Р  | G  |  |  |  |  |
| A5 | VG      | G  | MG   | М    | VP | MP | G  |  |  |  |  |

#### Table 9

#### TFN for Decision Maker's Opinion

|    | C1              | C2              | C3              | C4              | C5            | C6              | C7              |
|----|-----------------|-----------------|-----------------|-----------------|---------------|-----------------|-----------------|
|    |                 |                 |                 | From D1         |               |                 |                 |
| A1 | (0.6, 0.7, 0.8) | (0.3,0.4,0.5)   | (0.6,0.7,0.8)   | (0.6,0.7,0.8)   | (0,0.1,0.2)   | (0.3,0.4,0.5)   | (0.3,0.4,0.5)   |
| A2 | (0.6, 0.7, 0.8) | (0.7, 0.8, 0.9) | (0.7, 0.8, 0.9) | (0.7, 0.8, 0.9) | (0, 0.1, 0.2) | (0.6, 0.7, 0.8) | (0.7, 0.8, 0.9) |
| A3 | (0.3, 0.4, 0.5) | (0.3,0.4,0.5)   | (0, 0.1, 0.2)   | (0.1,0.2,0.3)   | (0, 0.1, 0.2) | (0.3, 0.4, 0.5) | (0.2, 0.3, 0.4) |
| A4 | (0.6, 0.7, 0.8) | (0.6, 0.7, 0.8) | (0.7, 0.8, 0.9) | (0.7, 0.8, 0.9) | (0, 0.1, 0.2) | (0.5, 0.6, 0.7) | (0.7, 0.8, 0.9) |
| A5 | (0.3, 0.4, 0.5) | (0.5, 0.6, 0.7) | (0.2, 0.3, 0.4) | (0.3,0.4,0.5)   | (0, 0.1, 0.2) | (0.3, 0.4, 0.5) | (0.6, 0.7, 0.8) |
|    |                 |                 |                 | From D2         |               |                 |                 |
| A1 | (0.3,0.4,0.5)   | (0.3,0.4,0.5)   | (0.5,0.6,0.7)   | (0.6,0.7,0.8)   | (0.1,0.2,0.3) | (0.3,0.4,0.5)   | (0.7, 0.8, 0.9) |
| A2 | (0.6, 0.7, 0.8) | (0.5, 0.6, 0.7) | (0.5, 0.6, 0.7) | (0.6, 0.7, 0.8) | (0.1,0.2,0.3) | (0.3, 0.4, 0.5) | (0.7, 0.8, 0.9) |
| A3 | (0.1, 0.2, 0.3) | (0.3, 0.4, 0.5) | (0.3,0.4,0.5)   | (0.3,0.4,0.5)   | (0.1,0.2,0.3) | (0.1, 0.2, 0.3) | (0.3,0.4,0.5)   |
| A4 | (0.7, 0.8, 0.9) | (0.6, 0.7, 0.8) | (0.7, 0.8, 0.9) | (0.6, 0.7, 0.8) | (0.1,0.2,0.3) | (0.3, 0.4, 0.5) | (0.8,0.9,1)     |
| A5 | (0.3, 0.4, 0.5) | (0.5, 0.6, 0.7) | (0.3, 0.4, 0.5) | (0.6, 0.7, 0.8) | (0.1,0.2,0.3) | (0.1, 0.2, 0.3) | (0.6, 0.7, 0.8) |
|    |                 |                 |                 | From D3         |               |                 |                 |
| A1 | (0.6,0.7,0.8)   | (0.3,0.4,0.5)   | (0.5,0.6,0.7)   | (0.1,0.2,0.3)   | (0,0.1,0.2)   | (0.2,0.3,0.4)   | (0.6,0.7,0.8)   |
| A2 | (0.7, 0.8, 0.9) | (0.6, 0.7, 0.8) | (0.6, 0.7, 0.8) | (0.7, 0.8, 0.9) | (0, 0.1, 0.2) | (0.2, 0.3, 0.4) | (0.7, 0.8, 0.9) |
| A3 | (0.3,0.4,0.5)   | (0.2,0.3,0.4)   | (0.1,0.2,0.3)   | (0.1,0.2,0.3)   | (0,0.1,0.2)   | (0.1,0.2,0.3)   | (0.1,0.2,0.3)   |
| A4 | (0.6, 0.7, 0.8) | (0.7, 0.8, 0.9) | (0.7, 0.8, 0.9) | (0.7, 0.8, 0.9) | (0,0.1,0.2)   | (0.1,0.2,0.3)   | (0.6,0.7,0.8)   |
| A5 | (0.7, 0.8, 0.9) | (0.6, 0.7, 0.8) | (0.5, 0.6, 0.7) | (0.3,0.4,0.5)   | (0, 0.1, 0.2) | (0.2, 0.3, 0.4) | (0.6,0.7,0.8)   |

### 4. Calculation

**i.** Table 10 presents the aggregated TFN and defuzzified values of importance rating. Defuzzified values are represented as "Weight" of the criteria. Aggregated values are determined by using Eq. (3) and Weight is determined by using Equation 4.

**ii.** Table 11 presents the performance scores of alternatives. Decision maker's rating was firstly aggregated and then defuzzified using Eq. (3) and Eq. (4), respectively.

iii. Table 12 presents Weighted Normalized Decision Matrix and Ideal Solutions. Weighted Normalized Decision Matrix was determined using Equation 6 and Ideal Solutions were determined using Eq. (7) and Eq. (8).

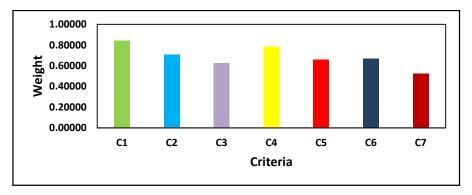
iv. Eq. (9) and Eq. (10) was used to determine separation measures, listed in Table 13.

v. Eq. (11) was used to determine closeness ratios which are listed in Table 14.

### Table 10

Weight for Each Criterion from Expert's Rating

|    | E-1             | E-2             | E-3             | E-4             | Aggregated      | Weight  |
|----|-----------------|-----------------|-----------------|-----------------|-----------------|---------|
| C1 | (0.7, 0.8, 0.9) | (0.7, 0.8, 0.9) | (0.7, 0.8, 0.9) | (0.8,0.9,1)     | (0.7,0.825,1)   | 0.84167 |
| C2 | (0.8,0.9,1)     | (0.4,0.5,0.6)   | (0.7, 0.8, 0.9) | (0.6, 0.7, 0.8) | (0.4,0.725,1)   | 0.70833 |
| C3 | (0.7, 0.8, 0.9) | (0.2, 0.3, 0.4) | (0.8,0.9,1)     | (0.6, 0.7, 0.8) | (0.2,0.675,1)   | 0.62500 |
| C4 | (0.8,0.9,1)     | (0.6, 0.7, 0.8) | (0.6, 0.7, 0.8) | (0.6, 0.7, 0.8) | (0.6,0.75,1)    | 0.78333 |
| C5 | (0.6, 0.7, 0.8) | (0.6, 0.7, 0.8) | (0.7, 0.8, 0.9) | (0.4, 0.5, 0.6) | (0.4,0.675,0.9) | 0.65833 |
| C6 | (0.7, 0.8, 0.9) | (0.6, 0.7, 0.8) | (0.7, 0.8, 0.9) | (0.4, 0.5, 0.6) | (0.4, 0.7, 0.9) | 0.66667 |
| C7 | (0.8,0.9,1)     | (0.2, 0.3, 0.4) | (0.1, 0.2, 0.3) | (0.4, 0.5, 0.6) | (0.1,0.475,1)   | 0.52500 |



## Fig. 4. Weight of Different Criteria

### Table 11

Performance Score of Each Alternative

|    | A1     | A2     | A3     | A4     | A5       |
|----|--------|--------|--------|--------|----------|
| C1 | 0.7    | 0.7444 | 0.3111 | 0.6556 | 0.6      |
| C2 | 0.4889 | 0.6556 | 0.3556 | 0.7444 | 0.655556 |
| C3 | 0.6111 | 0.7000 | 0.2444 | 0.7556 | 0.44444  |
| C4 | 0.4778 | 0.7556 | 0.2889 | 0.7556 | 0.533333 |
| C5 | 0.1444 | 0.2889 | 0.2000 | 0.2444 | 0.144444 |
| C6 | 0.4444 | 0.6444 | 0.3111 | 0.8000 | 0.555556 |
| C7 | 0.6111 | 0.7667 | 0.3889 | 0.8000 | 0.7      |

### Table 12

Values of Weighted Normalized Decision Matrix and Ideal Solutions

|    | V1       | V2       | V3       | V4       | V5       | $\mathbf{A}^{*}$ | $\mathbf{A}^{-}$ |
|----|----------|----------|----------|----------|----------|------------------|------------------|
| C1 | 0.31649  | 0.336584 | 0.140662 | 0.296395 | 0.271277 | 0.336584         | 0.140662         |
| C2 | 0.186024 | 0.249441 | 0.13529  | 0.283264 | 0.249441 | 0.283264         | 0.13529          |
| C3 | 0.205174 | 0.235017 | 0.082068 | 0.253669 | 0.149217 | 0.253669         | 0.082068         |
| C4 | 0.201045 | 0.317932 | 0.121562 | 0.317932 | 0.224423 | 0.317932         | 0.121562         |
| C5 | 0.051082 | 0.102164 | 0.070729 | 0.086446 | 0.051082 | 0.102164         | 0.051082         |
| C6 | 0.159165 | 0.230789 | 0.111415 | 0.286497 | 0.198956 | 0.286497         | 0.111415         |
| C7 | 0.172346 | 0.216216 | 0.109675 | 0.225616 | 0.197414 | 0.225616         | 0.109675         |

## Table 13

Values of Separation Measures

| Values of Separation Measures |          |          |          |          |          |          |          |          |          |          |
|-------------------------------|----------|----------|----------|----------|----------|----------|----------|----------|----------|----------|
|                               | S1*      | S2*      | S3*      | S4*      | S5*      | S1-      | S2-      | S3-      | S4-      | S5-      |
| C1                            | 0.000404 | 0        | 0.038385 | 0.001615 | 0.004265 | 0.080286 | 0.096267 | 0.002284 | 0.065755 | 0.049629 |
| C2                            | 0.009456 | 0.001144 | 0.021896 | 0        | 0.001144 | 0.015459 | 0.045301 | 0.002865 | 0.067623 | 0.045301 |
| C3                            | 0.002352 | 0.000348 | 0.029447 | 0        | 0.01091  | 0.044773 | 0.064674 | 0.001253 | 0.078965 | 0.017294 |
| C4                            | 0.013663 | 0        | 0.038561 | 0        | 0.008744 | 0.026352 | 0.107184 | 0.00251  | 0.107184 | 0.03816  |
| C5                            | 0.002609 | 0        | 0.000988 | 0.000247 | 0.002609 | 0.022326 | 0.122443 | 0.051318 | 0.083074 | 0.022326 |
| C6                            | 0.016213 | 0.003103 | 0.030654 | 0        | 0.007663 | 0.014084 | 0.04938  | 0.002465 | 0.091656 | 0.031046 |
| C7                            | 0.002838 | 0        | 0.013442 | 0        | 0.000795 | 0.010936 | 0.025316 | 0.000711 | 0.029171 | 0.018424 |

166

| Table 14                                  |          |
|---|----------|
| Values of Relative Closeness to the Ideal | Solution |
| A1  | 12       |

| Values of Rel | values of Relative Closeness to the Ideal Solution |          |          |          |          |  |  |  |  |  |
|---------------|--|----------|----------|----------|----------|--|--|--|--|--|
|               | A1   | A2       | A3       | A4       | A5       |  |  |  |  |  |
| RC            | 0.679781   | 0.912594 | 0.376846 | 0.943711 | 0.712624 |  |  |  |  |  |

#### 5. Results and discussion

Performance evaluation of green suppliers by placing the values of RC in Table 14 in ascending order, the Fuzzy TOPSIS method's use inside Bangladesh's pharmaceutical business produced the following ranking: A4>A2>A1>A5>A3.

Supplier A4 emerged as the top performer, displaying the highest stage of environmental sustainability practices and demonstrating a sturdy dedication to green tasks. This supplier validated wonderful overall performance in areas consisting of waste management, quality control, carbon footprint discount, and compliance with environmental policies. Following intently at the back of, Supplier A2 secured the second one position inside the ranking. This supplier showcased commendable efforts in enforcing inexperienced practices, especially in the regions of sustainable sourcing, waste control, and pricing. Supplier A1 attained the third function inside the evaluation, showing great performance in numerous environmental sustainability factors.

Notable strengths included strategic alliance with its partners for sustainability, Environment Management programs, and the implementation of environmentally friendly manufacturing processes. Supplier A5 secured the fourth role, demonstrating a moderate degree of green practices. While this dealer showcased a commitment to environmentally accountable operations, there remains room for improvement in terms of waste discount strategies and ordinary aid performance. Finally, Supplier A3 acquired the 5th function inside the ranking. Although this dealer established some green initiatives, there may be great scope for enhancement, especially in areas such as pollutants prevention, eco-design, and eco-labeling practices.

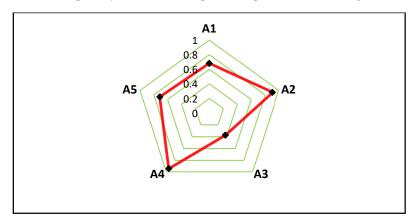


Fig. 5. Radar Chart Showing the RC Values of Different Supplier

In order to undertake a thorough investigation of green supplier performance in the pharmaceutical business in Bangladesh, this paper employed the fuzzy method (Fuzzy TOPSIS) approach for order prioritization by similarity of model solutions. The survey's major goal was to find and rank suppliers according to their environmental sustainability practices, and it concentrated on seven carefully chosen factors.

This research offers a significant contribution to the pharmaceutical sector in Bangladesh by furnishing decision-makers with vital information for identifying and nurturing partnerships with suppliers aligned with their sustainability objectives. By collaborating with high-performing environmentally-conscious manufacturers, pharmaceutical companies can not only reduce their ecological impact but also bolster their corporate image and competitive edge. Nonetheless, it's important to acknowledge the limitations of the Fuzzy TOPSIS-based analysis presented in this study. Future research endeavors may consider integrating additional criteria for conducting more comprehensive evaluations of green supplier performance. Additionally, longitudinal studies that track supplier progress over time can offer a more dynamic perspective on environmental practices within the pharmaceutical supply chain. Ultimately, this study aims to aid decision-makers within the Bangladeshi pharmaceutical industry through a systematic assessment of suppliers based on sustainability criteria. Furthermore, these findings will promote a deeper understanding of the significance of sustainability encompassing economic, environmental, and social dimensions within the pharmaceutical sector and related industries.

This study is aware of several restrictions. Seven criteria were identified after a thorough literature search and guidance from experts; however, they might not fully account for all pertinent elements. Future research could explore the incorporation of other relevant criteria to provide sound analysis. Furthermore, the present study contained responses from a small number of experts and decision-makers, which may introduce conceptual bias. To reduce this bias, future research could

expand the range of experts and decision-makers involved, providing a more diverse and representative perspective. Other MCDM methods with integrated approach may be used to check the ranking's stability and reliability. Moreover, this study primarily concentrated on the pharmaceutical industry within Bangladesh. It is worth considering that results may vary in countries with different economic, social, and environmental contexts. Therefore, further research could explore these variations in diverse settings to gain a more comprehensive understanding of the subject. Similar studies can be done in the future, concentrating more on disruptive situations.

In conclusion, the promotion of green practices in the pharmaceutical industry is crucial for achieving sustainable development and environmental protection. By choosing environmentally conscious suppliers and fostering collaborative relationships with high-performance green suppliers, Bangladeshi businesses can play an important role in sourcing practices in promoting environmental sustainability, contributing to a greener future for the region and the planet as a whole.

#### References

- Abdel-Baset, M., Chang, V., Gamal, A., & Smarandache, F. (2019). An integrated neutrosophic ANP & VIKOR method for achieving sustainable supplier selection: A case study in importing field. *Computers in Industry*, 106, 94-110.
- Al-Awamleh, H., Alhalalmeh, M., Alatyat, Z., Saraireh, S., Akour, I., Alneimat, S., & Al-Hawary, S. (2022). The effect of green supply chain on sustainability: Evidence from the pharmaceutical industry. Uncertain Supply Chain Management, 10(4), 1261-1270.
- Ashraf, S., Saleem, S., Chohan, A. H., Aslam, Z., & Raza, A. (2020). Challenging strategic trends in green supply chain management. *International Journal of Resource Engineering Application Science*, 5(2), 71-74.
- Badi, I., & Ballem, M. (2018). Supplier selection using the rough BWM-MAIRCA model: A case study in pharmaceutical supplying in Libya. Decision Making: Applications in Management & Engineering, 1(2), 16-33.
- Çalık, A. (2021). A novel Pythagorean fuzzy AHP & fuzzy TOPSIS methodology for green supplier selection in the Industry 4.0 era. Soft Computing, 25(3), 2253-2265.
- Chang, B., Chang, C.-W. & Wu, C.-H. (2011). Fuzzy DEMATEL method for developing supplier selection criteria. Expert Systems with Applications, 38(3), 1850-1858.
- Guo, Z., Liu, H., Zhang, D., & Yang, J. (2017). Green supplier evaluation & selection in apparel manufacturing using a fuzzy multi-criteria decision-making approach. *Sustainability*, 9(4), 650.
- Kabir, G., & Hasin, M. A. A. (2011). Comparative analysis of AHP & fuzzy AHP models for multicriteria inventory classification. *International Journal of Fuzzy Logic Systems*, 1(1), 1-16.
- Lee, A. H., Kang, H. Y., Hsu, C. F., & Hung, H. C. (2009). A green supplier selection model for high-tech industry. *Expert* systems with applications, 36(4), 7917-7927.
- Opricovic, S., & Tzeng, G. H. (2004). Compromise solution by MCDM methods: A comparative analysis of VIKOR & TOPSIS. *European journal of operational research*, *156*(2), 445-455.
- Pamucar, D., Torkayesh, A. E., & Biswas, S. (2022). Supplier selection in healthcare supply chain management during the COVID-19 pandemic: a novel fuzzy rough decision-making approach. *Annals of Operations Research*, 1-43.
- Papathanasiou, J., Ploskas, N., Papathanasiou, J., & Ploskas, N. (2018). TOPSIS Multiple Criteria Decision Aid: Methods, Examples and Python Implementations, 1-30.
- Puška, A., & Stojanović, I. (2022). Fuzzy multi-criteria analyses on green supplier selection in an agri-food company. Journal of Intelligence Management Decisions, 1(1), 2-16.
- Rahman, M. M., Bari, A. M., Ali, S. M., & Taghipour, A. (2022). Sustainable supplier selection in the textile dyeing industry: An integrated multi-criteria decision analytics approach. Resources. *Conservation & Recycling Advances*, 15, 200117
- Rashidi, K., & Cullinane, K. (2019). A comparison of fuzzy DEA & fuzzy TOPSIS in sustainable supplier selection: Implications for sourcing strategy. *Expert Systems with Applications*, 121, 266-281.
- Remadi, F. D., & Frikha, H. M. (2020). The Intuitionistic Fuzzy Set FlowSort methodology for green supplier Evaluation. Proceedings of International Conference on Decision Aid Sciences & Application (DASA), 719-725.
- Salimian, S., Mousavi, S. M., & Antucheviciene, J. (2022). An interval-valued intuitionistic fuzzy model based on extended VIKOR & MARCOS for sustainable supplier selection in organ transplantation networks for healthcare devices. Sustainability, 14(7), 3795.
- Thanh, N. V., & Lan, N. T. K. (2022). Solar Energy Deployment for the Sustainable Future of Vietnam: Hybrid SWOC-FAHP-WASPAS Analysis. *Energies*, 15(8), 2798.
- Tian, Z. P., Zhang, H. Y., Wang, J. Q., & Wang, T. L. (2018). Green supplier selection using improved TOPSIS & bestworst method under intuitionistic fuzzy environment. *Informatica*, 29(4),773-800.



© 2024 by the authors; licensee Growing Science, Canada. This is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC-BY) license (http://creativecommons.org/licenses/by/4.0/).

#### 168