



Article

Selection of Green Packaging Suppliers for Circular Economy Needs Using Intuitionistic Fuzzy Approach

Adis Puška ^{1,*}, Nebojša Kojić ², Aleksandra Pavlović ³, Ranko Bojanić ⁴, Ilija Stojanović ⁵, Vesna Krpina ⁶, Radivoj Prodanović ² and Miroslav Nedeljković ⁷

- Government of Brčko District, Department of Public Safety, Bulevara Mira 1, 76100 Brčko, Bosnia and Herzegovina
- Faculty of Economics and Engineering Management in Novi Sad, University Business Academy in Novi Sad, Cvećarska 2, 21000 Novi Sad, Serbia; nebojsa.kojic@fimek.edu.rs (N.K.); rprodanovic@fimek.edu.rs (R.P.)
- ³ The Academy of Applied Technical Studies—Polytechnic, Katarine Ambrozić 3, 11050 Belgrade, Serbia; apavlovic@atssb.edu.rs
- Faculty of Technical Sciences, University of Novi Sad, Trg Dositeja Obradovića 6, 21102 Novi Sad, Serbia; bojanic@uns.ac.rs
- College of Business Administration, American University in the Emirates, Dubai International Academic City, Dubai P.O. Box 503000, United Arab Emirates; ilija.stojanovic1976@gmail.com
- Hrvatske Šume, Kneza Branimira 1, 10 000 Zagreb, Croatia; vesna.krpina@gmail.com
- Institute of Agricultural Economics, 15 Volgina, 11060 Belgrade, Serbia; miroslav_n@iep.bg.ac.rs
- * Correspondence: adispuska@yahoo.com

Abstract

The specificity of the business of agro-food companies is that their products have little or no impact on the environment. However, environmental pollution of these products is caused by the use of packaging. Therefore, it is necessary to apply the principles of the circular economy in the business of companies. Applying green packaging that has little or no impact on the environment helps in preserving the environment. Companies usually purchase packaging from suppliers and therefore, it is necessary to choose the right supplier from which to purchase green packaging to support the implementation of the circular economy. The aim of this research is to select a green packaging supplier for company X in order to influence the development of a circular economy in the company's business. Based on this, the following research question is considered in this paper: how can the selection of a green packaging supplier influence the implementation of a circular economy at company X? The research covers ten criteria used in this selection, with which eight suppliers were observed. Because every decision-making process in the economy is characterized by risk and insecurity that affects the uncertainty in decision-making, an intuitionistic fuzzy set (IFS) was used. Determining the importance of weights was performed directly based on the ratings of the decision-maker (DM) and the steps of the SiWeC (Simple Weight Calculation) method, as well as using the Entropy method. The compromise results of these methods showed that the most important criteria for assessing the life cycle of packaging are transparency and ethics in business. The ranking of suppliers was carried out using the TOPSIS (Technique for Order of Preference by Similarity to Ideal Solution) method and its results showed that supplier 5 is the first choice for establishing long-term cooperation in the procurement of green packaging.

Keywords: supplier selection; green packaging; circular economy; agro-food industry; intuitionistic fuzzy approach



Academic Editors: Muhammad Omaii and Muhammad Salman Habib

Received: 11 August 2025 Revised: 27 August 2025 Accepted: 2 September 2025 Published: 5 September 2025

Citation: Puška, A.; Kojić, N.; Pavlović, A.; Bojanić, R.; Stojanović, I.; Krpina, V.; Prodanović, R.; Nedeljković, M. Selection of Green Packaging Suppliers for Circular Economy Needs Using Intuitionistic Fuzzy Approach. *Sustainability* **2025**, 17, 8008. https://doi.org/10.3390/ su17178008

Copyright: © 2025 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https://creativecommons.org/licenses/by/4.0/).

Sustainability **2025**, 17, 8008 2 of 29

1. Introduction

Environmental protection is a key factor in the business of companies. By applying the principles of the circular economy, companies differentiate themselves from the competition, which is increasing every day [1]. The principles of using the circular economy require that resources be used efficiently and waste be minimized, and that packaging be reused as much as possible [2]. These principles must be incorporated into the operations of agro-food companies that are under the influence of changes caused by increasing customer demands and environmental concerns by stakeholders [3]. Therefore, these companies must take care of product quality and reduce the pollution caused by their packaging [4].

Globally, plastic is increasingly being used as packaging. Plastic packaging makes up half of all waste [5]. Every year, more and more waste is caused by the use of plastic packaging. This is due to the growing demand of the population for food packaged in disposable plastic packaging [6]. Due to the inadequate management of plastic waste from packaging in the food industry, this waste is increasingly found in soil and water [7], and it affects environmental pollution [8]. Through decomposition into microplastics, this waste begins to appear in living organisms, including humans [9]. For this reason, more and more activities are being carried out to reduce pollution caused by the use of plastic in packaging. In this connection, there is a change in the packaging itself in order to reduce environmental pollution.

In order to solve this, packaging that has little or no impact on the environment [5] and which represents "green" packaging is increasingly being used. This packaging is made from biodegradable materials as well as materials that are easily recycled and reused. In this way, the application of the circular economy is implemented through the use of green packaging. Since this packaging is specific, it is necessary to purchase it from specialized suppliers. Therefore, the choice of suppliers is a key factor [6] that helps agrofood companies reduce waste generated by consuming their products and thus protect the environment.

Agro-food companies are required to ensure that their products are safe for consumer health, and that their packaging does not pollute the environment [7]. The use of green packaging improves the company's reputation and develops a recognizable brand in the market. This is especially important for new companies that have to fight for their place in the market. The importance of green packaging is that it is a very important tool in the circular economy because its use reduces waste and protects the environment [8]. In addition to preserving the environment, packaging has additional functions [9]. Packaging primarily protects the product, helps with its transport and storage from the manufacturer to the customer, and attracts customers to buy these products. In addition, the use of appropriate packaging reduces costs, which achieves the economic function of packaging, and in addition, packaging has a useful function that makes the product easier to use. In addition to being functional, it must differentiate the product from competing products, so great attention must be paid to the esthetics of the packaging itself.

This is especially important in the agro-food sector because products from this sector are constantly purchased and used by customers [10]. Their needs are growing because the population is increasing, so waste generated by the use of packaging is an increasing problem [11]. In order to solve this problem, business concepts are changing, and new paradigms are being created. Based on this, increasing importance is given to the circular economy [12], which aims to reduce resources and waste, and it is advocated that certain products be used and recycled multiple times [13]. By applying these principles, green packaging has become a very important and significant factor in reducing environmental impact [14]. Therefore, it is very important for agri-food companies to use green packaging for packaging their products in order to reduce the negative impact on the environment.

Sustainability **2025**, 17, 8008 3 of 29

Companies must involve suppliers from whom they purchase packaging in order to meet the increasingly strict environmental standards set on the market; the packaging design must also be appropriate to meet esthetic standards as well. Based on this, it can be concluded that packaging plays a very important role in food products and great attention must be paid to whom it is purchased from. The choice of supplier is therefore a very important item in the development of a circular economy and a green supply chain for companies [15]. By establishing a long-term partnership, it contributes to the improvement of business for both companies in this partnership. Therefore, it is very important to establish a partnership between the customer and the supplier because it helps both companies [16].

When establishing a partnership with a supplier, it is first necessary to determine which supplier can best help in achieving the company's goals. These company goals are presented in the form of criteria for selecting suppliers. In this research, ten criteria were used, which also represent sustainability criteria because they include economic, social, and environmental aspects. Potential suppliers were evaluated by these criteria. This is a classic decision-making problem [17] that is solved by applying multi-criteria decision-making methods (MCDMs). MCDMs are used when selecting an alternative—which, in this case, is suppliers—to be evaluated using multiple indicators or criteria [18].

In this research, the intuitionistic fuzzy approach (IFS) was used because the classic fuzzy set does not include uncertainty in decision-making. Uncertainty exists when the decision-maker (DM) does not have all the information related to the decision. On the other hand, uncertainty represents the inability of the DM to know what will happen in the future, and therefore the decision can be good or bad, and this also affects the uncertainty of the DM when making a decision. By applying the IFS approach, uncertainty in decision-making is adjusted to the decision. When defining the ratings, a membership function and a non-membership function are defined. Based on these functions, an uncertainty function is also defined, which represents the part that is not covered by the previous two functions, and thus uncertainty in decision-making is used. For the reason that the DM cannot have all the information, this decision-making problem will be solved by applying the IFS approach.

1.1. Research Motivation and Objectives

The supplier must help the company by providing green packaging with which the company will differentiate itself from its competitors. Companies must select one or several potential suppliers with whom to establish a partnership in order to improve the business of agro-food companies, taking into account the impact on the environment and the application of the principles of the circular economy. This choice falls within the domain of business decision-making, and each decision-making carries with it uncertainty and risks. Choosing the wrong supplier opens up possible problems in the company's business. Therefore, decision-makers (DMs) in companies always have a certain level of insecurity in the decision-making process. This research used the intuitionistic fuzzy approach (IFS). Applying this approach allows the company to cope with changes in the market in a dynamic business environment because it includes insecurity and uncertainty in the decision-making process. The motivation of this research based on all of the above is multifaceted because it includes the application of ecological principles in business through the application of green packaging, differentiation from competitors by building a recognizable brand, building a partnership with suppliers that will help in all this, and in addition, the application of the IFS approach in the decision-making process, which allows the inclusion of insecurity and uncertainty in the decision-making process.

Sustainability **2025**, 17, 8008 4 of 29

Due to the complexity of the motivation for this study, the research itself covered several segments that are very important for improving the company's business. In order to conduct this research, company X, which is an agro-food company, was the subject of observation. The company's business is agricultural production and the production of food products based on its own raw materials and raw materials from its subcontractors. The supplier selection process was carried out using IFS in order to include insecurity and uncertainty in the decision-making process. Based on this, the goal of this research is to select a supplier of green packaging using the IFS approach using appropriate criteria in order to apply the circular economy at company X through the development of long-term partnerships with the selected supplier. Based on this main goal, consolidated goals are also established. The first is to create a model for selecting suppliers of green packaging. The second is to refine the evaluation of selected criteria and suppliers. The third, using the MCDM method and the IFS approach, is to determine the importance of criteria and rank suppliers. Fourth, to select a supplier that best meets the set goals of company X with whom long-term business relationships will be established. Fifth, to create recognizable products by using green packaging.

Based on this research objective, the following research questions are raised and answered by this research:

- How can company X use green packaging to build a brand that will help it develop its business?
- What are the key criteria for selecting a green packaging supplier for company X in order to apply the principles of the circular economy?
- Which supplier best meets these criteria and with whom should long-term partnerships be established?
- How can the IFS approach be applied to include insecurity and uncertainty in the decision-making process?

1.2. Research Contribution

Due to the specificity of this research, its contributions are numerous in practice and theory. First, when studying the use of green packaging, the contribution of this research is how to apply the circular economy, because in the agro-food industry, packaging represents the biggest problem for the environment [5]. In order to prevent this, it is necessary to change the packaging industry and produce green packaging that does not have an impact on the environment. Second, the contribution of this research is on how to select packaging suppliers, where the focus is on developing companies' ecological business operations. Methodological frameworks are important criteria for selecting green packaging suppliers. Third, the contribution of this research is in the application of IFS, which allows the inclusion of insecurity and uncertainty in decision-making. Providing guidelines for the development of the IFS approach opens up new opportunities for further improving this approach. Fourth, this research contributes to the development of new approaches in future research in order to pay more attention to the selection of packaging suppliers, because packaging has a multiple function that can be used in marketing activities. The use of packaging also develops a brand, which helps a company's products become recognizable on the market and thus distances the company from the competition.

1.3. Paper Organization

This research is methodologically designed to apply seven thematically related selections. The first selection is an introduction in which introductory guidelines of the research subject, the motivation for conducting the research, objectives of the research questions, as well as the contributions of this research are given. The Literature Review section provides

Sustainability **2025**, 17, 8008 5 of 29

reviews of previous research in terms of the application of green packaging, the selection of packaging suppliers, as well as the application of IFS in supplier selection. The next section, Preliminaries and Methods, provides the basics of the application of the IFS approach as well as the steps of the methods used in this paper. The fourth section is a Case Study where the basics of the selection of green packaging suppliers are set using the example of the company X. The Results section deals with the processing of the obtained data and their presentation in the form of criterion weights as well as supplier rankings in order to choose the supplier with the best indicators in order to develop partnership relations with it; in addition, the influence of individual criteria is examined through sensitivity analysis. The sixth section explains the obtained results and answers the question as to why these results were obtained, the practical and theoretical implications of this research, as well as its limitations before providing guidelines for future research. The final section is the Conclusion, where the most important results of this research are given and how the research questions of this paper were answered.

2. Literature Review

The literature review examines several segments of the subject, namely research on green packaging, selection of packaging suppliers, and the exemplary IFS approach to supplier selection.

2.1. Research on Green Packaging

Research on green packaging has been present in many previous studies. Therefore, only some of the most relevant papers on green packaging are presented. Wu et al. [19] used evolutionary game theory to analyze the importance of green packaging in logistics, emphasizing the role of incentives and penalties by government organizations. Liu et al. [20] systematizes research on green logistics in China, pointing out shortcomings in areas such as intelligent logistics and cyclical models, which include green packaging. Chinomona & Bikissa-Macongue [21] analyze the construction industry in South Gauteng, showing that government pressure and green packaging significantly improve the logistics performance of these companies. These studies have looked at green packaging not only as an environmental issue but also as an application in logistics. Considering green packaging through the logistics segment is relevant to this research because suppliers are key in logistics processes. In addition, these papers emphasize the importance of green packaging in the packaging of agri-food products.

Aggarwal et al. [22] show that Indian millennials prefer green packaging due to both altruistic and personal interests, while Aldaihani et al. [23] emphasize that among Gen Z consumers, green packaging positively affects purchase intentions. Meet et al. [24] also conducted research on this generation and found that green packaging, along with other factors, influences green purchasing among Indian consumers. Shah et al. [25] prove in their research that green packaging and its design, along with the product range, increase customer purchase intentions. Otto et al. [26] investigated whether the use of green packaging affects consumers when purchasing food products and showed that there is little consumer knowledge about this packaging and that consumers buy these products less, something that was assumed by this research. Techawachirakul et al. [27] on the example of alcoholic products. They showed that customers have lower expectations for alcoholic products if green packaging is used if these products are packaged in paper bottles. These studies highlight the importance of investigating consumer perceptions regarding the acceptance of green packaging. This is very important for the development of a brand based on the use of this packaging, which represents one of the segments within the framework of this research.

Sustainability **2025**, 17, 8008 6 of 29

Dantas et al. [28] proved that green packaging has a positive impact on sustainability and environmental protection; however, the use of sensory packaging has a negative effect on sustainability and the environment. On the other hand, research conducted by the author Rodrigues et al. [29] confirmed that the use of sensors in packaging helps in recycling packaging and thus reduces the negative impact that packaging has on the environment. Hossain & Thakur [30] focus on the importance of green packaging in the healthcare sector and emphasize that this packaging is a driver of sustainability in pharmaceutical products. Wandosell et al. [5] conducted a literature review to make packaging as green as possible to reduce environmental impact. These studies emphasize the environmental aspect of green packaging, which is directly related to the conduct of this research.

Salandri et al. [31] find that green packaging alone does not improve companies' operational performance and their agility greatly affects this performance improvement, which highlights the importance of flexibility in implementing sustainable practices in companies' business. Mudgal et al. [32] develops a technical framework for selecting sustainable materials and experiments with three different packaging for carbonated juices using the TOPSIS method. Adela et al. [33] prove in their research the link between green packaging and competitive advantage in manufacturing companies in Ethiopia. The results of the research, conducted by the authors Chavadi et al. [34], showed that current satisfaction has a positive impact on customer engagement, experience, and satisfaction, with green packaging significantly affecting this satisfaction. These studies highlight that green packaging can be used in the context of improving a company's competitiveness. This segment is significant for this research because company X seeks to improve its competitiveness through exemplary green packaging.

In the research conducted by the author Kurniawan et al. [35], the willingness of Indonesian small- and medium-sized enterprises to pay a higher price for packaging if it is green packaging is associated. On the other hand, Alam [36] emphasizes the importance of green packaging, and it is necessary to work on consumer perception to accept this packaging in order to protect the environment. On the other hand, these studies highlight the willingness of consumers to purchase products packaged in green packaging. This is very important because it shows that green packaging can improve sales and improve business. Based on this, this packaging can be used to strengthen the brand of certain food products [37].

2.2. Selection of Packaging Suppliers

Carneiro et al. [38] point out in their research that packaging suppliers play a major role in the development of sustainable solutions for shellfish packaging, especially when using new materials. Yilmaz et al. [39], in their research, used data from suppliers of glass and PET packaging to analyze the efficiency of material use in order to calculate how many times a certain packaging can be used. On the other hand, Rocca et al. [40] developed in their research an assessment of the sustainability of cosmetic products, emphasizing the need to cooperate and purchase packaging from environmentally conscious suppliers. Jakubowska-Gawlik et al. [41] investigated the testing of packaging quality for the needs of the meat industry during the COVID-19 pandemic and proved that packaging affects product quality. Causil & Morais [42] dealt with in their research the selection of packaging suppliers, where they used a model based on sustainable criteria on the example of the food industry. Park & Waqar [43] analyzed returnable packaging in e-commerce applications using the fashion industry as an example. They used data from packaging suppliers to determine the impact of this packaging on the environment. Gunawan et al. [44] stated that choosing the right supplier can simplify a company's operations and increase profits and conducted their research using the example of choosing a supplier of cardboard

Sustainability **2025**, 17, 8008 7 of 29

packaging for shoes. Monteiro et al. [45] showed that the baking industry in Brazil still does not use environmentally certified packaging suppliers in order to reduce packaging waste. Gunawan et al. [46] investigated packaging suppliers using the example of the footwear industry in order to reduce costs and proved how to postpone packaging at distribution centers. All of this research showed that packaging suppliers play a major role in improving product quality and that packaging affects product purchases. For this reason, great attention must be paid to whom this packaging is purchased from and to ensure that the packaging does not have a negative impact on the environment, is completely biodegradable, and can be easily recycled.

2.3. Applying the IFS Approach When Selecting Suppliers

In many studies, IFS was used in the selection of suppliers. For this reason, some of those studies will be tabulated here (Table 1).

Table 1. Application of the IFS approach when selecting suppliers.

Authors	Scope of Research	IFS Approach
Hendiani & Walther [47]	Selection of a sustainable supplier	Interval-valued IFS
Rukhsar et al. [48]	Selection of a green supplier	IFS circular
Baki et al. [49]	Selection of a digital supplier	Interval-valued IFS
Jiang & Wang [50]	Selection of suppliers in shipbuilding	Hybrid IFS
Jia et al. [51]	Selection of suppliers of green building materials	Group exponential IFS
Yasin et al. [52]	Selection of a green supplier	Cubic IFS
Chakraborty et al. [53]	Selection of pharmaceutical supplier	IFS
Ghazvinian et al. [54]	Lean, Agile, Resilient, Green, and Sustainable Supplier Selection	IFS
Chang [55]	Selection of suppliers during the epidemic of the COVID-19 virus	Fermatean fuzzy information IFS
Trupti & Umap [56]	Selection of pharmaceutical supplier	IFS
Hu & Ren [57]	Selection of suppliers for construction projects	Interval-valued IFS Hamacher
Wan et al. [58]	Choice of battery suppliers for electric vehicles	multi-criteria, large-scale group decision-making IFS
Majumdar et al. [59]	Selection of resilient suppliers	Trapezoidal IFS
Song et al. [60]	Selection of a green supplier	Interval-valued IFS
Wu et al. [61]	Selection of suppliers of electrical appliances	IFS
Kahraman et al. [62]	Risk analysis-based supplier selection	IFS with Ordered Pairs
Çakır & Taş [63]	Supplier selection problem for a seamless supply chain network	IFS circular
Qadir et al. [64]	Supplier selection in logistics service value creation	IFS double hierarchy linguistic term set
Hsu & Lee [65]	Selection of offshore suppliers	IFS

As can be seen in this research review (Table 1), many papers used the IFS approach for supplier selection. Also, previous research used the SiWeC and TOPSIS methods for the IFS approach for supplier selection. The SiWeC method for the IFS approach was used by Puška et al. [66] for the selection of equipment and machinery suppliers for the needs of the Agriculture 4.0 system. The TOPSIS method has been used in many other

Sustainability **2025**, 17, 8008 8 of 29

studies. Dutta & Konwar [67] developed the Quintic Fuzzy Set in their research and took the selection of suppliers as an example and ranked them using the TOPSIS method. However, they indirectly used the IFS approach and TOPSIS methods and compared these two approaches. The indirect use of the IFS approach for the TOPSIS method was also used by the authors Wu et al. [68], where the IFS approach is based on symmetric Jensen–Shannon divergence and they compared the results obtained with the TODIM method (an acronym in Portuguese for Interactive Multi-criteria Decision-Making) with the results obtained with the TOPSIS method. Ghazvinian et al. [54] used the TOPSIS method in their research to select Lean, Agile, Resilient, Green, and Sustainable Suppliers.

Trupti & Umap [56] used the TOPSIS method and the IFS approach in the example of supplier selection for the pharmaceutical industry. Ali et al. [69] selected a green supplier using the TOPSIS method but used several approaches, of which the IFS approach was one of them to solve the group decision-making problem. Kong et al. [70] examined supplier and consumer satisfaction with technological offerings using the TOPSIS method. Majumdar et al. [59] selected resilient suppliers during the COVID-19 pandemic and used the Trapezoidal IFS and TOPSIS methods. Kahraman et al. [62] performed risk analysisbased supplier selection where they used the TOPSIS method and the IFS with Ordered Pairs approach, where the determination of the membership function is performed by including functional and dysfunctional attitudes. Qadir et al. [64] used supplier selection in logistics service value creation, where the TOPSIS method and the IFS double hierarchy linguistic term set approach were used. Liu et al. [71] selected material suppliers in emergency situations by applying group decision-making and using the hybrid priority weight average operator in the IFS approach, before ranking the suppliers with the TOPSIS method. Kahraman et al. [72] performed the selection of suppliers in third party logistics for the needs of the pharmaceutical industry using IFS with the TOPSIS method. Islam & Arakawa [73] used the AHP (Analytic Hierarchy Process) and TOPSIS methods to select a supplier using the IFS approach. Liu et al. [74] used the TOPSIS method in the group selection of suppliers using an interval-valued approach.

When presenting the TOPSIS method in the IFS approach to supplier selection, it was observed that this approach has been used in many studies. The reason for this is the popularity of the TOPSIS method, which has been used since 1981 [75]. However, this method has not been used in the selection of packaging suppliers using the IFS approach. Based on this, this is only one of the gaps that this research addresses. In addition, the selection of suppliers of green packaging has not been given too much importance in previous research, which is another gap that this research seeks to address. This research promotes the use of green packaging in the circular economy in order to reduce environmental pollution from the disposal of used packaging. In addition, the combination of the SiWeC and TOPSIS methods has not been used so far in the IFS approach, so this is one of the gaps that this research addresses. Based on this, it can be seen that this research provides new guidelines for studying certain areas in the circular economy in order to influence the reduction in the negative effects of food product packaging.

3. Preliminars and Methods

With the development of the decision-making system in theory and practice, different approaches appeared that were upgraded over time. With the development of the fuzzy approach [76], the basis for decision-making was given when the DM does not have all the information, so the exact boundaries of the sets cannot be defined, so the fuzzy approach is used. This approach allows the DM to make decisions even with imprecise information. However, decision-making in the economy is always accompanied by a certain level of

Sustainability **2025**, 17, 8008 9 of 29

insecurity and uncertainty. For this reason, the author Atanassov [77] defined the IFS, which takes in addition to the degree of belonging of the elements to a set.

With the development of decision-making systems in theory and practice, various approaches emerged that were upgraded over time. With the development of the fuzzy approach [76], the basis for decision-making was provided when the DM does not have all the information at its disposal, so the exact boundaries of the sets cannot be defined, so the fuzzy approach is used. This approach allows the DM to make decisions using imprecise information. However, decision-making in economics is always accompanied by a certain level of uncertainty and risks. For this reason, the author Atanassov [77] defined the IFS, which takes into account, in addition to the degree of membership of elements to a set $(\mu_A(x))$, the degree of non-membership to that set $(v_A(x))$ is taken. Based on the membership and non-membership of elements in set A, the degree of insecurity $(\pi_A(x))$ is also defined. IFS can be defined through a set A as

$$A = \{(x, \mu_A(x), v_A(x)) | x \in X\}$$
 (1)

Based on the degree of membership and non-membership, the degree of insecurity is calculated as follows:

$$\pi_A(x) = 1 - \mu_A(x) - v_A(x) \tag{2}$$

In order to implement this approach, it is necessary to define basic operations with IFS. These operations serve to use the appropriate methods in this approach.

$$A \cdot B = \{x, \mu_A(x) \cdot \mu_B(x), v_A(x) + v_B(x) - v_A(x) \cdot v_B(x), | x \in A\}$$
(3)

$$A + B = \{x, \mu_A(x) + \mu_B(x) - \mu_A(x) \cdot \mu_B(x), v_A(x) \cdot v_B(x), | x \in A\}$$
(4)

$$A - B = \{x, \min(\mu_A(x), \mu_B(x)), \max(\mu_B(x), v_A(x), | x \in A\}$$
 (5)

In order to use this approach in the decision-making process, it is first necessary to define the ratings with which the importance of the criteria will be determined and how individual suppliers meet these criteria. In this research, unique ratings in the form of linguistic values were used (Table 2). When defining these linguistic values, it is also necessary to define intuitionistic fuzzy numbers (IFN) that represent the membership function of these linguistic values. IFNs are defined so that the values are inverse. The best value is the inverse of the worst value, and each IFN has its own inverse value. In this way, these IFNs defined in this way are symmetric. This symmetry is usually used when determining preference pairs in fuzzy logic, when determining the value of fuzzy numbers, and such values allow giving the same uncertainty value for all ratings. If the DM is uncertain in the rating, he is equally uncertain no matter which value he chooses. He cannot be less uncertain if he has given a higher or lower value. His insecurity is due to the incomplete information he has in the decision-making process, and not in the ratings he gives. Therefore, in this research, it was decided that IFNs should be inverse and symmetrical.

In this study, a modified principle of transforming IFN into crips values, which was applied by the authors Işık, & Adalar [78], was applied. The reason for this approach is that it is not necessary to modify the methods and adapt them to the IFS approach, but rather to use classical methods. The steps of this approach are as follows:

- Step 1. Evaluation of DMs using linguistic values.
- Step 2. Defining IFNs based on linguistic values.
- Step 3. Formation of an aggregate decision matrix for IFNs:

$$\check{R} = \left[\check{A}_{m\alpha}\right]_{nxk} \tag{6}$$

Step 4. Defining the IFN positive ideal solution (τ^+) and negative ideal solution (τ^-).

Step 5. Determining the distance measure by applying the Euclidean equation to determine the positive (δ_m^+) and negative distances (δ_m^-) :

$$\delta_m^+ = \sqrt{\left(\mu_{\check{A}_m} - \tau^+\right)^2 + \left(v_{\check{A}_m} - \tau^+\right)^2 + \left(\pi_{\check{A}_m} - \tau^+\right)^2} \tag{7}$$

$$\delta_{m}^{-} = \sqrt{\left(\mu_{\check{A}_{m}} - \tau^{-}\right)^{2} + \left(v_{\check{A}_{m}} - \tau^{-}\right)^{2} + \left(\pi_{\check{A}_{m}} - \tau^{-}\right)^{2}} \tag{8}$$

Step 6. Calculation of closeness coefficient (CC):

$$CC_m = \frac{\delta_m^-}{\delta_m^+ + \delta_m^-} \tag{9}$$

The *CC* values serve as crisp numbers and are the basis for forming a decision matrix for determining the importance of criteria weights, as well as for ranking alternatives.

Table 0 Lineariatic column	for 1 tion - fine			1:
Table 2. Linguistic values	for evaluation of im	ibortance of criteria	and evaluation of s	suppliers.

Linguistic Terms	Abbreviation	IFNs
Extremely good	EXG	[0.90, 0.00]
Very very good	VVG	[0.80, 0.10]
Very good	VEG	[0.70, 0.20]
Good	GOO	[0.60, 0.30]
Medium good	MEG	[0.50, 0.40]
Fair	FAI	[0.40, 0.50]
Medium bad	MEB	[0.30, 0.60]
Bad	BAD	[0.20, 0.70]
Very bad	VEB	[0.10, 0.80]
Very very bad	VVB	[0.00, 0.90]

3.1. Methodology and Steps of the MCDM

MCDMs are used to determine the importance of criteria and rank alternatives. In order to use these methods, it is first necessary to define the research methodology (Figure 1).

In order to determine the importance of criteria and alternatives in the form of green packaging suppliers, it is first necessary to perform an assessment by DMs. They perform the assessment using defined linguistic values (Table 2), and then these values are transformed and IFN is formed. Then the IFN value is transformed into crips value in the manner explained in the previous text. Based on these values, decision matrices are then formed for the criteria weights and for the alternatives. After that, the selected MCDMs are used.

In this research, three methods were selected to be used, namely the SiWeC and Entropy methods, which were used to determine the importance of the criteria, as well as the TOPSIS method, which was used to rank the suppliers. The SiWeC method is a newer MCDM that determines the weight of the criteria, and this method belongs to the methods for subjective determination of the weights of the criteria. Unlike other methods that belong to this group of methods for subjective determination of weights, it is not necessary to compare the criteria with each other, as well as to rank the criteria by importance [79]. It is enough to give an assessment of the importance of the criteria based on the preferences of the DM and his assessment of how important a certain criterion is to them. In addition, this method also determines the importance of the DM based on their ratings, and it is also very simple to use since there are not many steps. The Entropy and TOPSIS methods are methods that have existed for many years, and their justification has been shown in many papers, which is why these methods were chosen. As can be seen from the selected methods, two are used to determine the weight of the criteria, namely SiWeC and Entropy.

The reason why these methods are used is to reduce the subjective influence of the DM on the final decision, and therefore the Entropy method was used, which is one of the objective methods for determining the weights. The weight of the criteria is then obtained by compromising the weights of these two methods. The steps of these methods are explained in the following text.

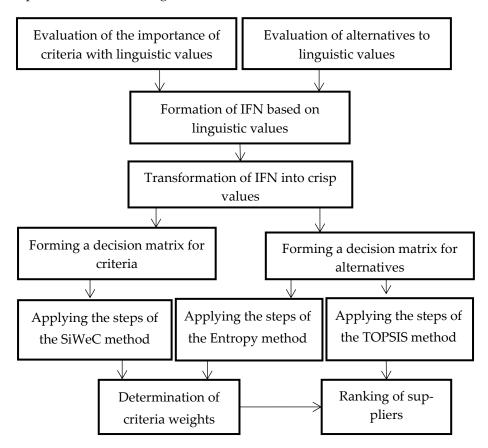


Figure 1. Research methodology.

The SiWeC method was first used by the authors Puška et al. [80] to determine the weights of sales channels. This method has the following steps:

Step 1. Normalization of CCs for the following criteria:

$$n_{ij} = \frac{x_{ij}}{x_{ijmax}} \tag{10}$$

where x_{ijmax} is the maximum value of the CC per individual criterion.

Step 4. Calculating the standard deviation (st.dev_i) for DMs.

Step 5. Multiplying the normalized values with the standard deviation:

$$v_{ij} = n_{ij} \times st. dev_j \tag{11}$$

Step 6. Calculating the sum of criteria weights:

$$s_{ij} = \sum_{j=1}^{n} v_j \tag{12}$$

Step 7. Calculation of final values of criteria weights:

$$w_{ij} = \frac{s_{ij}}{\sum_{j=1}^{n} s_{ij}}$$
 (13)

The basics of using Entropy were given by Shannon [81] in the framework of information theory. This approach is upgraded and adapted to the MDCM approach. The specificity of this and other objective methods is that the weights of the criteria are calcu-

lated based on the initial decision matrix for the alternatives [82]. Based on this, the steps of this method are as follows [83]:

Step 1. Normalization of CCs for the alternatives:

$$n_{ij} = \frac{x_{ij}}{x_{imax}},\tag{14}$$

where x_{jmax} is the highest value of an individual criterion

Step 2. Determining the Entropy Value (E_i):

$$E_i = \frac{\sum_{j=1}^n p_{ij} \cdot \ln p_{ij}}{\ln n} \tag{15}$$

Step 4. Calculating criteria weights:

$$w_{ij} = \frac{1 - E_i}{\sum_{i=1}^{m} (1 - E_i)} \tag{16}$$

TOPSIS methods were first used by the authors Hwang & Yoon [75]. The steps of this method are as follows:

Step 1. Normalization of CCs for alternatives

$$n_{ij} = \frac{x_{ij}}{\sqrt{\sum_{i=1}^{m} x_{ij}^2}} \tag{17}$$

Since the scores are created in such a way that regardless of the criterion, the scores must be higher in order for the alternatives to be ranked better; only this normalization is used for cost criteria.

Step 2. Aggravating of normalized values:

$$v_{ij} = n_{ij} \cdot w_{ij} \tag{18}$$

Step 3. Determination of ideal and negative ideal alternatives:

$$A^{+} = \{v_{1}^{+}, v_{2}^{+}, \dots v_{n}^{+}\} = \{(\max_{i} v_{ij} j \in J_{1}), (\min_{i} v_{ij} j \in J_{2})\}$$
(19)

$$A^{-} = \{v_{1}^{-}, v_{2}^{-}, \dots v_{n}^{-}\} = \{(\min x_{i}v_{ij}j \in J_{1}), (\max x_{i}v_{ij}j \in J_{2})\}$$
(20)

When defining ideal alternatives, it is necessary that the alternatives be as close as possible to ideal alternatives and as far as possible from negative ideal alternatives.

Step 4. Calculation of the deviation from the ideal and the negative ideal alternative:

$$S_i^+ = \sqrt{\sum_{j=1}^n \left(v_{ij} - v_j^+\right)^2}$$
 (21)

$$S_i^- = \sqrt{\sum_{j=1}^n \left(v_{ij} - v_j^-\right)^2}$$
 (22)

Step 5. Calculation of the deviation from the ideal alternative:

$$C_i = \frac{S_i^-}{S_i^- + S_i^+} \tag{23}$$

3.2. Case Study

Company X is a company engaged in production in the agro-food sector with an emphasis on fruit products. The headquarters of this company is in the northeast of Bosnia and Herzegovina. It is a new company in the agro-food sector. Its business includes agricultural production and uses raw materials from this production to make its food products. Therefore, it must carry out various activities in order to fight for its place in the market. The company carries out various activities in order to strengthen the brand of its products. In order to improve its business, this company decided to use green packaging to develop a recognizable product and thus distance itself from the competition. Since

company X does not have its own capacity to produce green packaging, they purchase this packaging from suppliers. In order to further develop its business, the company decided to establish a partnership with certain suppliers in order to have a reliable supplier on which it can rely. In order to apply this decision-making process, this company first identified eight suppliers engaged in the production of green packaging. All of these suppliers are from the territory of Bosnia and Herzegovina. The reason for this decision is that if they come from other countries, the purchased packaging must be imported either through an intermediary or company X must purchase it directly from them, which means that it must solve the problem of customs clearance and import. This poses the problem that the packaging, even if produced on time, cannot be delivered on time due to customs procedures. Then, this company also selected the criteria by which it would observe these suppliers (Table 3). A total of 10 criteria were selected, which included ecological, economic and social criteria. In this way, a sustainable selection of green packaging suppliers was applied to these criteria. Finally, DMs were selected who would first determine the importance of these criteria and then evaluate the selected suppliers with these criteria. A total of five employees were selected to be DMs. All these employees have at least five years of experience. Based on this, the problem of this research can be posed using a closed diagram for the example of company X. This diagram essentially represents the business activities of company X (Figure 2). This process represents the first process, while in the second process, the activities will only be reduced by no longer choosing a green packaging supplier but purchasing green packaging from the selected supplier. Therefore, the choice of a green packaging supplier is important for company X.

Table 3. Criteria for selecting green packaging suppliers.

Id	Criterion	Description	References
C1	Application of ecological standards	The supplier should have developed environmental standards and certificates to prove this	Jia et al. [51]; Yasin et al. [52]; Song et al. [60]
C2	Use of renewable and recycled materials	Packaging should be made of renewable and/or recycled materials	Jia et al. [51]; Ghazvinian et al. [54]
C3	Life cycle assessment of packaging	Assessment of the environmental footprint of the packaging throughout its entire life cycle	Yasin et al. [52]; Ghazvinian et al. [54]
C4	Product quality, functionality and protection	Packaging should protect the product and not affect the quality of the product	Hendiani & Walther [47]; Jiang & Wang [50]
C5	Cost-effectiveness	The price-value ratio obtained by using green packaging	Baki et al. [49]; Jiang & Wang [50]; Song et al. [60]
C6	Product innovation and design	The supplier's ability to improve the product and its design, which should be functional, esthetically appealing, and environmentally sustainable	Yasin et al. [52]; Ghazvinian et al. [54]; Puška et al. [66]
C7	Supplier social responsibility	The way the supplier applies social responsibility policies in its business	Hsu & Lee [65]; Wu et al. [68]; Liu et al. [20]
C8	Delivery capacity and reliability	Delivery should be able to be made on time and in the required quantities	Jiang & Wang [50]; Song et al. [60]
C9	Supplier reputation	Evaluation of the performance of suppliers and the impact that customers have had in doing business with them	Hendiani & Walther [47]; Ghazvinian et al. [54]; Hsu & Lee [65]
C10	Transparency and ethics in business	The way the supplier applies transparency and ethical codes in its business	Hsu & Lee [65]; Wu et al. [68]; Liu et al. [20]

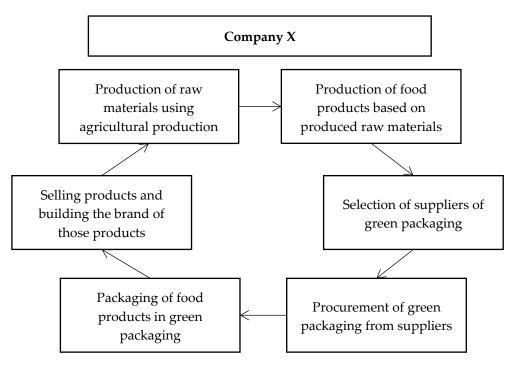


Figure 2. Diagram of company X's business activities.

4. Results

In order to determine which supplier should be selected for establishing a long-term partnership, it is first necessary to determine the importance of the criteria and then to rank the suppliers. Since the weights of the criteria are needed for ranking suppliers, how important individual criteria are for the ranking process should thus be determined first. Therefore, the weights of the criteria are first determined using the SiWeC method and then using the Entropy method. The reason for this is that for determining the weights using the SiWeC method, it is necessary for the DM to give an assessment of the importance of the criteria, while for determining the weights using the Entropy method, it is necessary for the DM to evaluate the suppliers with the selected criteria.

The first step in determining the weights using the SiWeC method is to assess the importance of the criteria using linguistic values by the DM (Table 4). After that, the IFN is formed where the linguistic values are transformed into these numbers. For example, the linguistic value EXG is transformed into IFN [0.90, 0.00], the value VVG into IFN [0.80, 0.10], while the other values are transformed according to certain values of IFN defined in Table 1. Since IFNs are defined symmetrically using inverse values, the uncertainty in all these ratings is the same and amounts to 0.1. For example, for the linguistic value EXG, it is calculated as follows $\pi_A(x) = 1 - 0.9 - 0.0 = 0.1$.

After linguistic values are transformed into IFN and insecurity values are determined, these values are transformed into crisp values. The next step is to calculate the positive and negative distance. On the example of criteria C1 and DM1, the calculation procedure is performed as follows:

$$\delta_1^+ = \sqrt{(0.80 - 1)^2 + (0.10 - 0)^2 + (0.10 - 0)^2} = 0.245$$

$$\delta_1^- = \sqrt{(0.80 - 0)^2 + (0.10 - 1)^2 + (0.10 - 0)^2} = 1.208$$

After these deviations are calculated, the closeness coefficient (CC) value is calculated. In the same example, the calculation procedure is performed as follows:

$$CC_1 = \frac{1.208}{0.245 + 1.208} = 0.831$$

By applying this procedure, each linguistic value is first transformed into membership and non-membership functions, and an uncertainty function is determined. These functions are then transformed into crips values. In this way, all these functions are adjusted to these values. Therefore, crips values do not take the value one because uncertainty is present in the decision-making process and affects it. Due to the good ratings of all criteria, the lowest value is 0.549, while the highest value is 0.905.

Ġ	lab.	le 4	ł	Impor	tance	ot	crit	teria	based	on	DMs'	rating	

	Criteria	DM1	DM2	DM3	DM4	DM5
C1	Application of ecological standards	VVG	EXG	VVG	VEG	VEG
C2	Use of renewable and recycled materials	VEG	VVG	EXG	VVG	VVG
C3	Life cycle assessment of packaging	GOO	VVG	VEG	GOO	MEG
C4	Product quality, functionality and protection	EXG	EXG	EXG	EXG	EXG
C5	Cost effectiveness	VVG	VEG	GOO	VEG	VEG
C6	Product innovation and design	GOO	GOO	MEG	MEG	MEG
C7	Supplier social responsibility	MEG	GOO	GOO	MEG	GOO
C8	Delivery capacity and reliability	VVG	EXG	VVG	VVG	EXG
C9	Supplier reputation	VEG	VEG	VEG	GOO	VVG
C10	Transparency and ethics in business	GOO	VEG	VEG	MEG	VEG

This procedure is continued for all criteria and all DMs, and an initial decision matrix is formed (Table 5), which is the basis for calculating the criteria values based on the SiWeC method.

Table 5. Initial decision matrix for calculating the importance of criteria.

	C1	C2	C3	C4	C5	C6	C7	C8	C9	C10
DM1	0.831	0.741	0.645	0.905	0.831	0.645	0.549	0.831	0.741	0.645
DM2	0.905	0.831	0.831	0.905	0.741	0.645	0.645	0.905	0.741	0.741
DM3	0.831	0.905	0.741	0.905	0.645	0.549	0.645	0.831	0.741	0.741
DM4	0.741	0.831	0.645	0.905	0.741	0.549	0.549	0.831	0.645	0.549
DM5	0.741	0.831	0.549	0.905	0.741	0.549	0.645	0.905	0.831	0.741

The next step in the calculation of criteria weights using the SiWeC method is the calculation of normalization. Unlike the normalization applied in some other MCDMs, in the SiWeC method, all values are divided by the highest value for all criteria. In other MCDMs, dividing by individual criteria is performed by dividing that criterion by the highest value of that criterion. The highest value among all values is 0.905 and all individual values are divided by this value, and this way, a normalized decision matrix is formed. In the same example, it is calculated as follows:

$$n_{11} = \frac{0.831}{0.905} = 0.919$$

The next step is to calculate the standard deviation values for the DM ratings. These values for DMs are, respectively, as follows: 0.125, 0.112, 0.130, 0.145, 0.144. Based on these values, it can be said that the grades in DM4 are the most dispersive, so the value of the standard deviation is the highest. Applying these values when multiplying with

normalized values gives the most importance to DM4. In the same example, the procedure for calculating that step looks as follows:

$$v_{11} = 0.831 \times 0.125 = 0.115$$

In this way, an aggravated decision matrix is obtained (Table 6) where the normalized values are multiplied by the standard deviation. After that, aggregate values for individual criteria are calculated, and finally the weights for the criteria are calculated. The procedure for calculating those steps on the example of criterion C1 looks as follows:

$$s_1 = 0.115 + 0.112 + 0.119 + 0.119 + 0.118 = 0.583; w_1 = \frac{0.583}{5.379} = 0.108$$

Table 6. Aggravated decision matrix and calculation of weights using the SiWeC method.

	C1	C2	C3	C4	C5	C6	C 7	C8	C 9	C10
DM1	0.115	0.103	0.089	0.125	0.115	0.089	0.076	0.115	0.103	0.089
DM2	0.112	0.103	0.103	0.112	0.092	0.080	0.080	0.112	0.092	0.092
DM3	0.119	0.130	0.106	0.130	0.092	0.079	0.092	0.119	0.106	0.106
DM4	0.119	0.133	0.103	0.145	0.119	0.088	0.088	0.133	0.103	0.088
DM5	0.118	0.133	0.087	0.144	0.118	0.087	0.103	0.144	0.133	0.118
	C1	C2	C3	C4	C5	C6	C7	C8	C9	C10
s_{ij}	0.583	0.601	0.489	0.656	0.536	0.423	0.439	0.624	0.536	0.493
w_{ij}	0.108	0.112	0.091	0.122	0.100	0.079	0.082	0.116	0.100	0.092

Based on the steps of the SiWeC method and the DM assessment, the most important criterion was the criterion C4—Product quality, functionality and protection, followed by the criterion C8—Delivery capacity and reliability, while the least important criterion is C6—Product innovation and design.

The first step for calculating the Entropy method and ranking suppliers using the TOPSIS method is the evaluation of suppliers by DMs based on the selected criteria (Table 7). This step is similar to the evaluation of the importance of criteria, except that DMs evaluate suppliers of green packaging using the selected criteria. The further procedure is the same as in the SiWeC method, except that when IFNs are formed, the average IFN values are calculated so that each of the DMs has the same role in the decision-making process, so these steps are not explained in detail because they have already been explained in the SiWeC method.

After the IFNs are transformed into crips values, an initial decision matrix is formed (Table 8) for calculating the weights of the criteria using the Entropy method and ranking the suppliers using the TOPSIS method.

The first step in the Entropy method is data normalization. Unlike the SiWeC method, the Entropy method determines the highest value for each criterion and divides all values in that criterion by that value. In the example of Supplier 1 and criterion C1, the calculation procedure is performed as follows:

$$n_{11} = \frac{0.413}{0.797} = 0.518$$

The other normalized values are calculated in the same way, and a normalized decision matrix is formed. The next step is the calculation of Entropy Value (E_i). On the example of criterion C1, the calculation procedure is performed as follows:

$$E_1 = \frac{0.518 \cdot \ln(0.518) + 0.664 \cdot \ln(0.664) + \dots + 0.640 \cdot \ln(0.640)}{\ln 8} = -0.983$$

Sustainability **2025**, 17, 8008 17 of 29

Based on the entropy value, the final value of the criterion weights is also calculated. On the example of criterion C1, the weight calculation procedure is carried out as follows:

$$w_1 = \frac{1 - (-0.983)}{1 - (-0.983) + 1 - (-0.983) + 1 - (-0.632) + \dots + 1 - (-1.053)} = 0.108$$

Table 7	Linguistic	evaluation	of the imr	ortance	of suppliers.
Table 7.	Linguistic	evaluation	or the mil	ortance (oi subbileis.

DM1	C1	C2	C3	C4	C5	C6	C7	C8	C9	C10
Supplier 1	FAI	MEB	BAD	GOO	MEG	MEG	MEG	MEB	FAI	MEB
Supplier 2	FAI	VVG	GOO	GOO	MEG	MEG	MEG	VVG	VEG	GOO
Supplier 3	GOO	MEG	FAI	GOO	VEG	VEG	FAI	VEG	VEG	FAI
Supplier 4	FAI	MEB	FAI	FAI	FAI	FAI	MEB	GOO	MEB	MEG
Supplier 5	VEG	EXG	VVG	EXG	GOO	MEG	MEG	EXG	EXG	EXG
Supplier 6	MEG	MEG	MEB	EXG	VVG	VEG	MEG	MEG	VEG	GOO
Supplier 7	FAI	MEG	MEB	VVG	MEG	GOO	FAI	GOO	GOO	FAI
Supplier 8	MEG	GOO	MEG	VVG	MEG	VEG	FAI	MEG	MEB	FAI
		:	:	:	:	:	:	:	:	:
DM5	C1	C2	C3	C4	C5	C6	C7	C8	C9	C10
Supplier 1	FAI	MEB	BAD	MEG	FAI	FAI	FAI	FAI	MEB	MEB
Supplier 2	MEG	VEG	GOO	VEG	GOO	GOO	MEG	VEG	VEG	GOO
Supplier 3	GOO	MEG	MEG	GOO	VEG	GOO	MEG	GOO	GOO	MEG
Supplier 4	FAI	FAI	FAI	MEG	FAI	FAI	MEB	MEG	MEB	FAI
Supplier 5	VEG	EXG	VVG	VVG	VEG	GOO	GOO	VVG	VVG	EXG
Supplier 6	MEG	MEG	FAI	VVG	VEG	VEG	MEG	GOO	GOO	GOO
Supplier 7	FAI	MEG	FAI	VEG	GOO	GOO	FAI	GOO	MEG	MEG
Supplier 8	MEG	MEG	FAI	VEG	MEG	GOO	FAI	MEG	FAI	FAI

Using this procedure, weights are calculated for all criteria. The most important criterion is C3—Packaging Life Cycle Assessment, followed by criterion C10—Transparency and ethics in business, while the least important criterion is C6—Product innovation and design (Table 9). In order to obtain the final weights, the individual weights of the criteria obtained by the SiWeC and Entropy methods are multiplied. In this way, the subjective influence of DM on determining the importance of the criteria is reduced. After the product of these weights has been calculated, it is necessary to normalize it so that the weight value is equal to one. For this reason, normalization, which in practice is called percentage normalization, was used. In this normalization, the individual product of the weights of the criteria is divided by the sum of the products of all the criteria.

Table 8. Initial decision matrix for alternatives.

	C 1	C2	C3	C4	C5	C6	C 7	C8	C 9	C10
Supplier 1	0.413	0.355	0.259	0.549	0.471	0.490	0.451	0.432	0.374	0.355
Supplier 2	0.529	0.759	0.607	0.703	0.607	0.587	0.510	0.759	0.741	0.626
Supplier 3	0.626	0.568	0.490	0.607	0.703	0.684	0.490	0.684	0.665	0.510
Supplier 4	0.393	0.432	0.413	0.490	0.451	0.451	0.355	0.568	0.355	0.451
Supplier 5	0.797	0.881	0.814	0.866	0.722	0.626	0.607	0.866	0.866	0.881
Supplier 6	0.510	0.510	0.432	0.849	0.759	0.722	0.510	0.568	0.665	0.626
Supplier 7	0.451	0.510	0.413	0.741	0.626	0.626	0.451	0.626	0.568	0.471
Supplier 8	0.510	0.568	0.471	0.741	0.568	0.665	0.451	0.510	0.432	0.451

Sustainability **2025**, 17, 8008 18 of 29

	C1	C2	C3	C4	C5	C6	C 7	C8	C9	C10
E_i	-0.983	-0.983	-1.073	-0.632	-0.616	-0.528	-0.692	-0.840	-0.909	-1.053
$\overline{1-E_i}$	1.983	1.983	2.073	1.632	1.616	1.528	1.692	1.840	1.909	2.053
w_j	0.108	0.108	0.113	0.089	0.088	0.083	0.092	0.101	0.104	0.112

Table 9. Calculating criteria weights using the Entropy method.

On the example of criterion C1, the procedure for calculating the final weights is carried out as follows:

$$w_1 = \frac{0.108 \cdot 0.108}{0.108 \cdot 0.108 + 0.112 \cdot 0.108 + 0.091 \cdot 0.113 + \dots + 0.092 \cdot 0.112} = 0.117$$

By applying this procedure to all criteria, the final results of the criterion weight values were obtained (Table 10). The results of this approach showed that the most important criterion is criterion C2—Use of renewable and recycled materials, followed by criterion C1—Application of environmental standards. These two criteria were not evaluated as the best by the results obtained using the SiWeC and Entropy methods. However, their weight values were the most consistent, which is why these criteria were characterized as the most important criteria. In this way, the application of the objective approach was used to correct the importance of the weights in relation to the subjective assessments of the DM. What is specific is that the least important criterion using both of these methods is criterion C6—Product innovation and design, and its importance is therefore even lower than it is with both of these methods.

Table 10. Final value of criteria weights.

Weight	C 1	C2	C3	C4	C 5	C6	C 7	C8	C9	C10
SiWeC	0.108	0.112	0.091	0.122	0.100	0.079	0.082	0.116	0.100	0.092
Entropy	0.108	0.108	0.113	0.089	0.088	0.083	0.092	0.101	0.104	0.112
SiWeC x Entropy	0.012	0.012	0.010	0.011	0.009	0.007	0.008	0.012	0.010	0.010
w_j	0.117	0.121	0.103	0.109	0.088	0.066	0.075	0.116	0.104	0.103

After the importance of the criteria has been calculated, the ranking is determined using the TOPSIS method. The first step of the TOPSIS method is the normalization of the initial decision matrix for alternatives (Table 7). The specificity of this method is that it uses a different type of normalization and that it differs from normalization in the SiWeC and Entropy methods. Using the example of criterion C1 and Supplier 1, the procedure for calculating this normalization is performed as follows:

$$n_{11} = \frac{0.413}{\sqrt{0.413^2 + 0.529^2 + 0.626^2 + \dots + 0.510^2}} = 0.2689$$

In this normalization, the individual value is divided by the value of the square root of the sum of the degrees of all individual values in that criterion. It is therefore necessary to first calculate this value of the square root, then divide all the individual values of that criterion by that value. After the normalized values are calculated, they are weighted with the appropriate weight of the criteria. In the same example, the aggravation procedure is carried out as follows:

$$v_{11} = 0.269 \times 0.117 = 0.031$$

After that, the ideal and negative ideal alternatives are determined (Table 11). The ideal alternative is the highest value of the alternative for a given criterion, while the

negative ideal alternative is the lowest value of the alternative for a given criterion. After these values are determined, the deviation from these values is calculated.

	C1	C2	C3	C4	C5	C6	C7	C8	C 9	C10
A^+	0.061	0.063	0.058	0.047	0.038	0.027	0.033	0.056	0.052	0.056
Supplier 1	0.031	0.025	0.018	0.030	0.023	0.019	0.025	0.028	0.023	0.023
Supplier 2	0.040	0.054	0.043	0.038	0.030	0.022	0.028	0.049	0.045	0.040
Supplier 3	0.048	0.041	0.035	0.033	0.035	0.026	0.027	0.044	0.040	0.033
Supplier 4	0.030	0.031	0.029	0.027	0.022	0.017	0.020	0.036	0.021	0.029
Supplier 5	0.061	0.063	0.058	0.047	0.036	0.024	0.033	0.056	0.052	0.056
Supplier 6	0.039	0.037	0.031	0.046	0.038	0.027	0.028	0.036	0.040	0.040
Supplier 7	0.034	0.037	0.029	0.040	0.031	0.024	0.025	0.040	0.034	0.030
Supplier 8	0.039	0.041	0.033	0.040	0.028	0.025	0.025	0.033	0.026	0.029
	0.030	0.025	0.018	0.027	0.022	0.017	0.020	0.028	0.021	0.023

Table 11. Aggravated decision matrix and ideal and negative ideal alternatives.

In order to explain how the deviation from these values is calculated, the calculation procedure is explained using the example of Supplier 1.

$$S_1^+ = \sqrt{(0.031 - 0.061)^2 + (0.025 - 0.063)^2 + (0.018 - 0.058)^2 + \dots + (0.023 - 0.056)^2} = 0.078$$

$$S_1^- = \sqrt{(0.031 - 0.030)^2 + (0.025 - 0.025)^2 + (0.018 - 0.018)^2 + \dots + (0.023 - 0.023)^2} = 0.007$$

In the same way, the value deviation of other suppliers is calculated and finally the final value of the TOPSIS method is formed. On the example of Supplier 1, the procedure for calculating the final value of the TOPSIS method is performed as follows:

$$C_1 = \frac{0.007}{0.007 + 0.078} = 0.079$$

Based on the supplier ratings and the steps of the TOPSIS method, supplier rankings were obtained. The best results were shown by Supplier 5, followed by Supplier 2, while the worst results were shown by Supplier 1 (Table 12). Based on these results, it can be concluded that Supplier 5 is the best choice for company X to establish a long-term partnership in order to purchase green packaging from it, which is an important component of the circular economy.

Table 12. Final value of the TOPSIS method.

Supplier	S_i^+	S_i^-	C_i	Rank
Supplier 1	0.078	0.007	0.079	8
Supplier 2	0.032	0.053	0.627	2
Supplier 3	0.042	0.042	0.502	3
Supplier 4	0.071	0.015	0.174	7
Supplier 5	0.004	0.081	0.952	1
Supplier 6	0.050	0.040	0.444	4
Supplier 7	0.054	0.030	0.358	5
Supplier 8	0.055	0.030	0.354	6

In order to prove these results, a comparison of the results of the TOPSIS method with the results of other MCDMs is performed. In this comparative analysis, the same weights and the same initial decision matrix are taken for the alternatives, but different methods are applied for ranking suppliers. In this study, the result of the TOPSIS method is compared with the results of seven other MCDMs. The CORASO method (COmpromise

Sustainability **2025**, 17, 8008 20 of 29

Ranking from Alternative SOlutions) was chosen because its steps resemble the TOPSIS method, but a different normalization is applied, and instead of calculating the deviation, the utility function is calculated in relation to the ideal and negative ideal alternatives. The SAW (Simple Additive Weighting) method was taken in this analysis because this is the simplest MCDM method where, after weighting, the aggregate value for the alternatives is calculated and a rank order is formed with this value. The MABAC (Multi-Attributive Border Approximation area Comparison) method is specific in that the rank order of the alternatives is performed based on the geometric mean of the values of the alternatives. In addition, this method applies a different normalization and the weighting itself is different. The ARAS (Additive Ratio Assessment) method was chosen because it uses a different normalization, and the final value of the alternative is calculated based on the utility function in relation to the ideal alternative. The MARCOS (Measurement Alternatives and Ranking according to Compromise Solution) method is one of the new methods that have been most widely used in practice. Its specificity is that the deviation from the ideal and anti-ideal solutions is calculated, and a ranking is formed using the utility function and the degree of utility. The WASPAS (Weighted Aggregated Sum Product Assessment) method uses a combination of the two methods, WSM and WPM, and a compromise is made between the results of these two methods. The CRADIS (Compromise Ranking of Alternatives from Distance to Ideal Solution) method uses modified steps of other methods and is specific in that it also uses one modified step of the TOPSIS method, which is the calculation of the deviation from the ideal and anti-ideal solutions.

The results of this approach show that the difference in ranking is only with the TOPSIS method, as well as for Supplier 3 and Supplier 6 (Figure 3). The reason for this should be sought in the specifics of using specific normalization and calculating deviations from the ideal and negative ideal alternatives. However, this difference does not affect the selection of suppliers with whom a long-term partnership relationship will be established, which is Supplier 5.

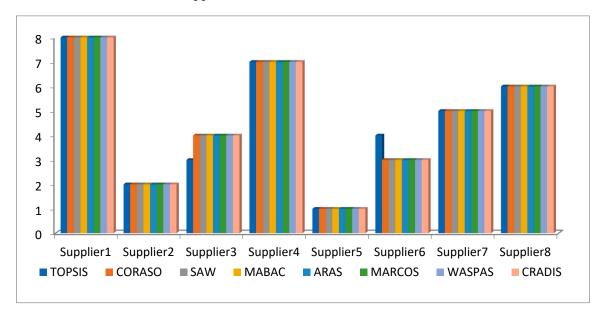


Figure 3. Results of comparative analysis.

At the end of the results of this research, a sensitivity analysis is performed. This analysis aims to change the weights of the criteria and to determine how this change in weights plays a role in the final ranking of the alternatives. In this research, the importance of individual criteria is reduced by 90%, while the remaining criteria is increased by 10% so

Sustainability **2025**, 17, 8008 21 of 29

that the sum of the weights is approximately equal to one (1). Since there are 10 criteria, each individual criterion is reduced ten times, thus forming ten scenarios (Figure 4).

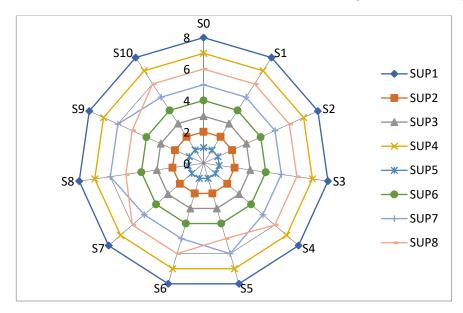


Figure 4. Results of the sensitivity analysis.

The results of this analysis show that the ranking order changed for Supplier 7 and Supplier 8, while the ranking order did not change for the other suppliers. This is because the ranking of these two suppliers had the smallest difference in the final value of the TOPSIS method, so with the reduction in the importance of certain criteria, this ranking order changed. The changes came when the importance of criteria C5, C8, and C9 decreased. The change in ranking therefore occurred because Supplier 7 had better indicators in these criteria. With the decrease in the importance of these criteria, Supplier 8 then achieved a better ranking (Figure 4). The ranking order did not change for the other suppliers, which confirms that one criterion does not play a major role in the ranking of suppliers, but that all the criteria used affect it. Therefore, in order for a supplier to be as good as possible, it must improve all criteria.

5. Discussion

Environmental protection has become an important segment of every agro-food company [84]. That is why these companies are increasingly turning to a circular way of doing business where the focus is on product reuse. However, the product itself cannot be reused by these companies, but its packaging can be reused. In addition, the greatest environmental pollution is caused by packaging. Research by Fogt Jacobsen et al. [85] has shown that solving the problem of packaging has become a global problem, especially since after the use of food products, packaging becomes waste. Therefore, great attention must be paid to the type of packaging that will be used in the products of these companies. This research was therefore focused on the selection of suppliers of green packaging for the needs of the circular economy, because company X does not have the capacity to produce this packaging itself. Another reason is that it is necessary to change the way this company does business to dedicate itself to the production of this packaging, and for this it is necessary to have machines and raw materials, so it is easier to obtain this packaging from suppliers. Green packaging, as shown by research by the author Salandri et al. [31], can improve the business of companies, and this is especially important for the business of agro-food companies.

The supplier is a very important aspect of supply chain management in a company [86]. The supply chain encompasses all activities that are directed from the selection of sup-

pliers to the sale of products to the customer [87]. Therefore, the first step in the supply chain is the selection of suppliers. This selection directs the company's operations. If a supplier is selected that helps achieve the company's goals, that company will achieve good results and vice versa. Therefore, it is important that the supply chain secures raw materials, intermediate materials and packaging from suppliers, which is necessary for the production process of company X. The supplier also plays a role in reducing environmental pollution, because it helps agro-food companies reduce this pollution. He offers companies green packaging, and thus the environment is preserved. This packaging, as shown by the research of the author Adela et al. [33], helps improve the competitive advantage of companies. However, in order to choose a green packaging supplier with whom long-term business cooperation will be established that will also affect the development of the circular economy in these companies, it was necessary to develop a methodology that is adapted to solving this problem. For this purpose, ten criteria were selected to help company X to choose a green packaging supplier. These criteria emphasized the importance of not only purchasing green packaging but also choosing a supplier that is green and sustainable, as the focus was on economic and ecological criteria along with social criteria [88].

Since every decision-making in the economy is accompanied by a certain uncertainty and insecurity that is present in DM, it was decided to apply the IFS approach. This approach, as shown by research by Trupti & Umap [56] and many other authors, has shown good results when it is necessary to incorporate insecurity into decision-making. In this approach, it is determined how many elements belong to and how many do not belong to a certain set, as well as the rest that neither belong nor do not belong to the set represent insecurity in decision-making. In order to use this approach in this research, this belonging and non-belonging to the set had to be defined. This was performed by using an inverse symmetric series where the highest value is inversely symmetrical to the lowest value. In addition, all linguistic values were given the same percentage of insecurity because it is difficult to determine how much uncertainty there is in DM ratings. They would then have to determine their insecurity for each assessment, which would greatly complicate the DM's work. Therefore, this approach was decided, which made the decision-maker's job easier. In this research, a method of transforming these defined IFNs into crips values was also used, based on the approach presented in the research by Işık & Adalar [78], and this approach was further simplified in order to be used as much as possible in practice.

This research used ten criteria for evaluating green packaging suppliers. These criteria should be aligned with the company's goals. If a company changes its goals, it is then necessary to change the criteria when selecting suppliers. Changing the criteria is thus linked to changing the company's business activities, which changes the company's vision and with it, the company's strategy and goals. Therefore, this decision-making model can be applied to other companies, provided that the criteria are aligned with the company's goals.

In order to further facilitate the DM's work in assessing the importance of criteria, the SiWeC method was chosen. As shown by the research by the author Puška et al. [80], when using the SiWeC method, it is not necessary for the DM to rank the criteria according to importance and compare the criteria in pairs, but it is sufficient to determine the importance of that criterion independently of other criteria [89]. Due to the great influence that the DM would have in this research, it was decided that in addition to the SiWeC method, the Entropy method, which is one of the objective methods for determining the importance of weight, should be used. In this way, using these two methods, a compromise was reached between the weights given in a subjective and objective way. The combination of the results of these methods showed that the highest weight does not necessarily have to be given to the criterion that has the highest importance in some of these methods, but that it has great importance in both methods. In this way, the criterion C3—Packaging

Life Cycle Assessment had the highest weight because it showed good values in both of these methods.

The TOPSIS method was used to determine the ranking of suppliers. This method is one of the most famous MCDMs for determining the ranking of alternatives and has been widely used in practice, as shown in this research. Its application was also in the selection of suppliers using the IFS approach, which is another reason why this method was used. By applying this method, it was shown that Supplier 5 has the best indicators of all other observed eight suppliers selected by company X. This supplier had the best indicators compared to other suppliers in eight criteria. Only in two criteria did other suppliers have better results, and these are criteria C5—Cost effectiveness and C6—Product innovation and design. It was to be expected that if one strives to provide good quality in packaging, one cannot expect the price of this packaging to be the most favorable. However, this supplier does not work on daily innovation of its products because they are of good quality and does not have to spend so much time improving its products. When compared in more detail, it is possible to see that this supplier also has good results in these two criteria. Supplier 2 was in second place. The reason why it was better than Supplier 3, who was ranked third, should be sought in the fact that it had better grades in most criteria. In three criteria, it had worse grades, namely in criteria C1—Application of ecological standards, C5—Cost-effectiveness, and C6—Product innovation and design. But in these criteria, the grades it received were not that much lower, which is why it was the secondranked supplier. These results were also proven by applying comparative analysis and sensitivity analysis. Based on this, this supplier represents the first choice with which this company would enter into long-term partnerships and thus improve its business and the application of the principles of the circular economy, because green packaging helps with this. This does not mean that company X should not purchase packaging from other suppliers and should only cooperate with this company. It should perform most of its packaging procurement activities with Supplier 5, while it should also cooperate with Suppliers 2 and 3 because they have also shown good results. This is because company X cannot influence the operations of other companies and therefore should cooperate with other suppliers.

5.1. Research Implications

The conducted research aimed to improve certain segments of research that were presented as gaps in this research. In addition, this research also has significant implications that affect the development of theory and practice: firstly, on the importance of supplier selection and secondly, on the importance of green packaging for the application of the principles of the circular economy. Therefore, this research has implications for the development of similar research focused on the selection of packaging suppliers because these suppliers have been marginalized in previous research. Greater focus is given to the selection of suppliers of raw materials and materials, because they have a great influence on the quality of the product itself. However, in companies that produce fruit and fruit products, they do not purchase raw materials from others but produce them themselves. Then, the focus of this research is on green packaging that helps reduce waste caused by packaging in food products. In addition, packaging should also help companies develop their brand. However, in order to select a green packaging supplier, it was necessary to develop a research methodology that included sustainable criteria. In this way, the implications of this research are on the development of similar research and improving the process of selecting suppliers of green packaging. This is how the theory of packaging supplier selection and the practical application of this selection methodology are improved. The focus was on green packaging having no impact on the environment, which would

Sustainability **2025**, 17, 8008 24 of 29

allow companies to emphasize the application of the principles of the circular economy. Therefore, it was important to link the impact of green packaging to the application of the circular economy, thereby developing theory and practice within the circular economy. The application of the IFS approach to supplier selection is not new in theory and practice, but rather a way to simplify this approach so that it can be used as widely as possible. Therefore, the implications of this research are also on the development of new approaches to the use of IFS.

Based on these theoretical and practical implications, this research also has managerial implications. First, managers in the decision-making process can apply the methodology from this research to help them select suppliers. However, with certain corrections, this methodology can also be used by managers to make other decisions for companies. By applying green packaging, managers can work on strengthening the brand for their products as well as reducing the negative impact of products on the environment. Based on this, managers, through the environmental benefits they receive from green packaging, improve the company's social responsibility and strengthen their reputation in the market. Based on this, it attracts new customers and leads to the emergence of loyal customers who are willing to pay more for products just to know that these products do not negatively affect the environment. By applying green packaging, managers also apply sustainability in their business. By balancing the application of sustainability and costs in business, managers work on market differentiation, which affects the development of the company's competitiveness. The implications of this research can also serve as a guideline for how the principles of the circular economy can be applied through the selection of suppliers and packaging. By applying it, managers meet the strict requirements regarding the safety of their product, thereby achieving advantages over other companies.

5.2. Limits and Directions for Future Research

Like any other research, this research has its limits. The biggest challenge was about the possibility of covering all segments in one survey, which is why guidelines for future research have been set. In the case of this research, the limits may be related to the research methodology itself, as well as to the criteria used in this research. It is always possible to use some other criteria, because in practice, there are a large number of criteria with which it is possible to choose a supplier. This research provided the basis for the selection of suppliers of green packaging, so it is necessary in future research to pay attention only to the criteria and make a selection that could solve this decision-making problem in the best way. For this reason, it is possible that some criteria are replaced with other criteria in this research as well. In addition, the number of suppliers can be set as a limit of this research. Due to the globalization of business, it is possible to obtain green packaging from any supplier in the world, but the problem is whether you can obtain the necessary packaging on time or if you have to increase the procurement costs and always have a larger amount of packaging in the warehouse. In this way, the company's operating costs also increase. The limit of the research may also be the IFS approach used in this study. This approach is more complex than the usual fuzzy approach, but unlike that approach, the IFS allows the insecurity present in DM to be included in the decision-making process. Therefore, an attempt was made to improve and simplify this approach in order to make it easier to use and to be used more in future research. A further limit of this research may be the methods used in this study. In order to reduce this limit, two methods were used that have been widely used in previous research and are accepted in practice. For this reason, a comparative analysis was used, which aimed to show that other methods can also be used in this approach and that they give similar results as the TOPSIS method. Therefore, in

Sustainability **2025**, 17, 8008 25 of 29

future research using this approach, other MCDMs should be used, thus ensuring diversity in the decision-making process and the use of MCDMs

6. Conclusions

The research conducted had several focuses. Through the selection of suppliers, using the example of company X, an attempt was made to show what role green packaging plays in the circular economy and what role the supplier plays in reducing the impact of packaging on the environment. The study of green packaging is important because food products themselves do not have a large impact on the environment, while packaging has a significant impact on environmental pollution. Therefore, it was important to choose a supplier who would deliver green packaging to company X. In order to carry out the supplier selection process, ten criteria were used that can be classified as basic sustainability criteria. In this way, the selection of green packaging suppliers was based on sustainable criteria.

Determining the importance of these criteria was carried out using a combination of subjective and objective approaches to determining weights and using the SiWeC and Entropy methods. In this way, the DM's assessments of the importance of the criteria as well as the DM's assessments of alternatives with these criteria were used. By compromising the results of these methods, the results obtained show that the most important criteria for selecting a green packaging supplier were the assessment of the packaging life cycle and transparency and ethics in business. Based on this, it can be concluded that the supplier should deliver green packaging that can be used multiple times, thus using the principles of the circular economy. On the other hand, this supplier must have transparent business operations and apply ethics in business, which further ensures the success of company X, because if a company has set ethical principles in business, it will use these principles in business operations and this company. However, what both of these methods have shown is that the criteria for innovation and product design are of the least importance, although these criteria are quite significant for the development of recognizable packaging that will help in brand development.

The ranking and selection of green packaging suppliers was carried out using the TOPSIS method. The results of this method show that Supplier 5 is the first choice for establishing long-term partnerships. This supplier showed the best indicators compared to other suppliers, which was determined based on DM ratings. These results were confirmed using additional analyses in the form of comparative analysis and sensitivity analysis. In all other MCDMs used, Supplier 5 showed the best results and was the first-ranked supplier. By applying sensitivity analysis, it was shown that changing the importance of certain criteria did not affect Supplier 5 from being ranked the best in certain scenarios. Based on this, it can be concluded that Supplier 5 had the best indicators compared to other suppliers and that it is the first choice for establishing long-term partnerships that will improve the business of both companies.

The way in which this research was conducted, which was based on a decision-making model, showed that it can be carried out wherever there is decision-making based on multiple criteria. This decision-making model can also be applied to other companies, provided that it is necessary to determine the goal of that company and adapt the decision-making model to that company. In this way, some of the criteria would be changed, but the essence and decision-making process would be the same. From all of the above, it can be concluded that both the research conducted and the formed decision-making model showed high flexibility and that it is possible to apply it to other companies.

Sustainability **2025**, 17, 8008 26 of 29

Author Contributions: Conceptualization, A.P. (Adis Puška) and M.N.; methodology, A.P. (Adis Puška); software, A.P. (Adis Puška); validation, N.K., A.P. (Aleksandra Pavlović), V.K. and R.B.; formal analysis, A.P. (Adis Puška); investigation, A.P. (Adis Puška); resources, R.P.; data curation, M.N.; writing—original draft preparation, A.P.; writing—review and editing, I.S. and M.N.; visualization, A.P. (Adis Puška); supervision, N.K.; project administration, R.B.; funding acquisition, M.N. All authors have read and agreed to the published version of the manuscript.

Funding: This research was funded by Ministry of Science, Technological Development and Innovation of the Republic of Serbia no. 451-03-136/2025-03/200009 from 4 February 2025.

Institutional Review Board Statement: Not applicable.

Informed Consent Statement: Not applicable.

Data Availability Statement: The authors confirm that the data supporting the findings of this study are available within the article.

Conflicts of Interest: Vesna Krpina is employed by Hrvatske Šume. The remaining authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

References

- 1. Ludin, D.; Arngold, C.; Balli, M.; Mueller, E.; Wellbrock, W. Green Organization—Arrived in companies or still a vision? An exploratory study based on an expert survey on the significance of sustainability and the implementation of sustainability management in companies. *Oeconomica Jadertina* 2024, 14, 101–117. [CrossRef]
- 2. Schmidt, J.; Grau, L.; Auer, M.; Maletz, R.; Woidasky, J. Multilayer Packaging in a Circular Economy. *Polymers* **2022**, *14*, 1825. [CrossRef] [PubMed]
- 3. Essien, N.A.; Umah, C.A.; Amarachi, I.A.U.; Samson, T.K. Modeling Retail Price Volatility of Selected Food Items in Cross River State, Nigeria Using GARCH Models. *Acadlore Trans. Appl. Math. Stat.* **2024**, *2*, 94–103. [CrossRef]
- 4. Roosen, M.; Mys, N.; Kleinhans, K.; Lase, I.S.; Huysveld, S.; Brouwer, M.; Thoden van Velzen, E.U.; Van Geem, K.M.; Dewulf, J.; Ragaert, K.; et al. Expanding the collection portfolio of plastic packaging: Impact on quantity and quality of sorted plastic waste fractions. *Resour. Conserv. Recycl.* 2022, 178, 106025. [CrossRef]
- 5. Ncube, L.K.; Ude, A.U.; Ogunmuyiwa, E.N.; Zulkifli, R.; Beas, I.N. An Overview of Plastic Waste Generation and Management in Food Packaging Industries. *Recycling* **2021**, *6*, 12. [CrossRef]
- 6. Ibrahim, I.D.; Hamam, Y.; Sadiku, E.R.; Ndambuki, J.M.; Kupolati, W.K.; Jamiru, T.; Eze, A.A.; Snyman, J. Need for Sustainable Packaging: An Overview. *Polymers* **2022**, *14*, 4430. [CrossRef]
- 7. Mahler, R.L. Public Perceptions and Evaluations of Drinking Water Quality in Idaho: A 35-Year Survey Analysis. *Oppor. Chall. Sustain.* **2024**, *3*, 147–157. [CrossRef]
- 8. Novarlić, B.; Krulec, J.; Arsić, T.; Sremac, S. Natural Hazards and Their Environmental Impact: Flood Risks in the Systemic Management of Non-Hazardous Municipal Waste. *Oppor. Chall. Sustain.* **2024**, *3*, 96–107. [CrossRef]
- 9. Kan, M.; Miller, S.A. Environmental impacts of plastic packaging of food products. *Resour. Conserv. Recycl.* **2022**, *180*, 106156. [CrossRef]
- 10. Wandosell, G.; Parra-Meroño, M.C.; Alcayde, A.; Baños, R. Green Packaging from Consumer and Business Perspectives. *Sustainability* **2021**, *13*, 1356. [CrossRef]
- 11. Andrejić, M.; Pajić, V. Managing Warehouse Risks for 3PL Providers: A Novel Approach Based on FMECA-DEA. *J. Organ. Technol. Entrep.* **2024**, 2, 113–121. [CrossRef]
- 12. Escursell, S.; Llorach-Massana, P.; Roncero, M.B. Sustainability in e-commerce packaging: A review. *J. Clean. Prod.* **2021**, 280, 124314. [CrossRef]
- 13. Schulte, A.; Kampmann, B.; Galafton, C. Measuring the Circularity and Impact Reduction Potential of Post-Industrial and Post-Consumer Recycled Plastics. *Sustainability* **2023**, *15*, 12242. [CrossRef]
- 14. Balaban, P.; Puška, A. Influence of packaging process on mechanical characteristics of the flexible packaging materials. *Adv. Eng. Lett.* **2022**, 2, 65–70. [CrossRef]
- 15. Zhang, S.; Wang, X.; Kinay, P.; Dau, Q. Climate Change Impacts on Potato Storage. Foods 2024, 13, 1119. [CrossRef] [PubMed]
- 16. Andalib Ardakani, D.; Soltanmohammadi, A.; Seuring, S. The impact of customer and supplier collaboration on green supply chain performance. *Benchmarking Int. J.* **2023**, *30*, 2248–2274. [CrossRef]
- 17. Kobylynska, T.; Hrynchak, N.; Motuzka, O. The Impact of the Circular Economy on Mitigating the Consequences of Climate Change in the Regions of Ukraine. *Econ.—Innov. Econ. Res. J.* **2024**, *12*, 115–131. [CrossRef]

Sustainability **2025**, 17, 8008 27 of 29

18. Enache, A.-C.; Grecu, I.; Samoila, P. Polyethylene Terephthalate (PET) Recycled by Catalytic Glycolysis: A Bridge toward Circular Economy Principles. *Materials* **2024**, *17*, 2991. [CrossRef]

- 19. Nguyen Quoc, T.; Nghiem Phuc, N.; Duong, N.-H. Examining green packaging, branding, and eco-labeling strategies: The case of young consumers' perceptions and responses in F&B industry. *Clean. Responsible Consum.* **2025**, *16*, 100258. [CrossRef]
- 20. Liu, A.; Osewe, M.; Shi, Y. Green logistics in China: A systematic literature review. *Int. J. Logist. Syst. Manag.* **2023**, 45, 88–107. [CrossRef]
- 21. Chinomona, E.C.; Bikissa-Macongue, M.B. The impact of green supply-chain management on logistics performance in the construction sector in South Africa. *J. Transp. Supply Chain Manag.* **2022**, *16*, a752. [CrossRef]
- 22. Aggarwal, S.; Dhanda, K.; Kumar, R.; Arora, U. Unpacking green choices: Exploring altruistic and egoistic values in shaping environmental identities and packaging preferences. *Asian J. Bus. Ethics* **2024**, *13*, 523–546. [CrossRef]
- 23. Aldaihani, F.M.F.; Islam, M.A.; Saatchi, S.G.; Haque, M.A. Harnessing green purchase intention of generation Z consumers through green marketing strategies. *Bus. Strategy Dev.* **2024**, *7*, e419. [CrossRef]
- 24. Meet, R.K.; Kundu, N.; Ahluwalia, I.S. Does socio-demographic, greenwashing, and marketing mix factors influence Gen Z purchase intention towards environmentally friendly packaged drinks? Evidence from emerging economy. *J. Clean. Prod.* **2024**, 434, 140357. [CrossRef]
- 25. Shah, A.; Zhang, Y.; Tanveer, M.; Ali, W.; Saleem, A.R. Effect of product assortment, Internet of Things, order fulfillment, green on purchase intention through the mediating role of shopping assistance. *J. Adv. Manuf. Syst.* **2023**, *22*, 123–147. [CrossRef]
- 26. Otto, S.; Strenger, M.; Maier-Nöth, A.; Schmid, M. Food packaging and sustainability—Consumer perception vs. correlated scientific facts: A review. *J. Clean. Prod.* **2021**, 298, 126733. [CrossRef]
- 27. Techawachirakul, M.; Pathak, A.; Motoki, K.; Calvert, G.A. Negative halo effects of sustainable packaging. *Psychol. Mark.* **2023**, *40*, 2627–2641. [CrossRef]
- 28. Dantas, R.; Sabir, I.; Martins, J.M.; Majid, M.B.; Rafiq, M.; Martins, J.N.; Rana, K. Role of green and multisensory packaging in environmental sustainability: Evidence from FMCG sector of Pakistan. *Cogent Bus. Manag.* **2023**, *10*, 2285263. [CrossRef]
- 29. Rodrigues, C.; Souza, V.G.L.; Coelhoso, I.; Fernando, A.L. Bio-based sensors for smart food packaging—Current applications and future trends. *Sensors* **2021**, 21, 2148. [CrossRef]
- 30. Hossain, M.K.; Thakur, V. Drivers of sustainable healthcare supply chain performance: Multi-criteria decision-making approach under grey environment. *Int. J. Qual. Reliab. Manag.* **2022**, *39*, 859–880. [CrossRef]
- 31. Salandri, L.; Cascio Rizzo, G.L.; Cozzolino, A.; De Giovanni, P. Green practices and operational performance: The moderating role of agility. *J. Clean. Prod.* **2022**, 375, 134091. [CrossRef]
- 32. Mudgal, D.; Pagone, E.; Salonitis, K. Selecting sustainable packaging materials and strategies: A holistic approach considering whole life cycle and customer preferences. *J. Clean. Prod.* **2024**, *481*, 144133. [CrossRef]
- 33. Adela, A.A.; Ayalewu, B.B.; Rahman, M.A.U. Effect of green products and green packaging on business performance with the mediating effect of competitive advantage: A case of manufacturing firms in Ethiopia. *Afr. J. Bus. Econ. Res.* **2024**, *19*, 417–437. [CrossRef]
- 34. Chavadi, C.A.; Kokatnur, S.S.; Sirothiya, M. Role of Q-commerce instant gratification on customer satisfaction: The moderating effect of green packaging. *Indian J. Mark.* **2024**, *54*, 30–50. [CrossRef]
- 35. Kurniawan, S.; Vincent, E.; Pratama, M.A.R. Investigating the factors influencing SMEs' willingness to pay a premium price for green packaging: A study of green perceived value, green attitude, and green awareness. *J. Logist. Inform. Serv. Sci.* 2024, 11, 301–311. [CrossRef]
- Alam, M.Z. A study on the selection motives and challenges faced by consumers concerning green packaged products. TEM J. 2023, 12, 2273–2283. [CrossRef]
- 37. Vidyarthy, A.K.; Kuthambalayan, T.S. Partnering Implementation in SMEs: The Role of Trust. Systems 2024, 12, 432. [CrossRef]
- 38. Carneiro, A.; Goes, C.B.; Mota, I.; Ferreira, R.; Cruz, A.; Marcos, B.; Sivertsvik, M.; Poças, F. Overview of clams packaging systems sustainability. *Trends Food Sci. Technol.* **2025**, *162*, 105080. [CrossRef]
- 39. Yilmaz, C.; Müller, K.; Blanke, L.; Dorn, V.; Rohrmeier, T.; Schinkel, K.; Tischler, C.; Vafaieshoar, M.; Fell, T.; Sängerlaub, S. Material use efficiency of primary packaging of fast-moving consumer goods. *Chem. Ing. Tech.* **2025**, *97*, 269–277. [CrossRef]
- 40. Rocca, R.; Acerbi, F.; Fumagalli, L.; Taisch, M. Development of an LCA-based tool to assess the environmental sustainability level of cosmetics products. *Int. J. Life Cycle Assess.* **2023**, *28*, 1261–1285. [CrossRef]
- 41. Jakubowska-Gawlik, K.; Kolanowski, W.; Mantzoros, D.; Czarniecka-Skubina, E.; Trafialek, J. Remote assessment of quality, processing and economic criteria in qualification of suppliers to the meat packaging foil producer—A Greek case study. *PLoS ONE* 2023, 18, e0278021. [CrossRef] [PubMed]
- 42. Causil, O.M.M.; Morais, D.C. Multicriteria negotiation model for selecting sustainable suppliers' problem in the agribusiness. *Production* **2023**, 33, e20220090. [CrossRef]
- 43. Park, J.; Waqar, Z. Life cycle assessment of returnable mailers used for apparel electronic commerce: A case study in Canada. *Packag. Technol. Sci.* **2022**, *35*, 651–662. [CrossRef]

Sustainability **2025**, 17, 8008 28 of 29

44. Gunawan, I.; Trihastuti, D.; Sianto, M.E.; Godelva, I. Selecting Shoes Box Suppliers using DE-MATEL-ANP-WZOGP Approach. *PROZIMA (Product. Optim. Manuf. Syst. Eng.)* **2022**, *6*, 72–84. [CrossRef]

- 45. Monteiro, N.B.R.; Moita Neto, J.M.; da Silva, E.A. Life cycle management in bakeries: A proposed roadmap towards sustainability. *Int. J. Life Cycle Assess.* **2022**, *27*, 82–97. [CrossRef]
- 46. Gunawan, I.; Trihastuti, D.; Kumar, A.; Tan, K.H. Integrated DANP and binary goal programming model in generating joint-decision making for packaging postponement and supplier selection. *Ann. Oper. Res.* **2025**, *346*, 981–1010. [CrossRef]
- 47. Hendiani, S.; Walther, G. Towards sustainable futures: Rethinking supplier selection through interval-valued intuitionistic fuzzy decision-making. *Int. J. Prod. Econ.* **2025**, *285*, 109620. [CrossRef]
- 48. Rukhsar, M.; Hussain, A.; Ullah, K.; Moslem, S.; Senapati, T. Intelligent decision analysis for green supplier selection with multiple attributes using circular intuitionistic fuzzy information aggregation and frank triangular norms. *Energy Rep.* **2025**, *13*, 5773–5791. [CrossRef]
- 49. Baki, R.; Ecer, B.; Aktas, A. A decision framework for supplier selection in digital supply chains of E-commerce platforms using interval-valued intuitionistic fuzzy VIKOR methodology. *J. Theor. Appl. Electron. Commer. Res.* **2025**, 20, 23. [CrossRef]
- 50. Jiang, Q.; Wang, H. A Hybrid Intuitionistic Fuzzy Entropy–BWM–WASPAS Approach for Supplier Selection in Shipbuilding Enterprises. *Sustainability* **2025**, *17*, 1701. [CrossRef]
- 51. Jia, Z.; Liu, L.; Diao, Z. A Group Intuitionistic Fuzzy Exponential TODIM Method Considering Attribute Interactions Applied to Green Building Material Supplier Selection. *Sustainability* **2024**, *16*, 7885. [CrossRef]
- 52. Yasin, Y.; Riaz, M.; Kausar, R.; Aslam, M. Enhancing sustainability in supply chain management using softmax Schweizer–Sklar information aggregation. *Eng. Appl. Artif. Intell.* **2024**, *133*, 108181. [CrossRef]
- 53. Chakraborty, S.; Raut, R.D.; Rofin, T.M.; Chakraborty, S. On solving a healthcare supplier selection problem using MCDM methods in intuitionistic fuzzy environment. *Opsearch* **2024**, *61*, 680–708. [CrossRef]
- 54. Ghazvinian, A.; Feng, B.; Feng, J.; Talebzadeh, H.; Dzikuć, M. Lean, Agile, Resilient, Green, and Sustainable (LARGS) Supplier Selection Using Multi-Criteria Structural Equation Modeling under Fuzzy Environments. *Sustainability* **2024**, *16*, 1594. [CrossRef]
- Chang, K.-H. A novel flexible supplier selection method in the environment of Fermatean fuzzy information and incomplete information. Ann. Oper. Res. 2024, Advance online publication. [CrossRef]
- 56. Trupti, B.; Umap, H. Evaluating and Selecting a Supplier in a Healthcare Supply Chain Using the Technique for Order Performance by Similarity to Ideal Solution under Intuitionistic Fuzzy Environment. *Int. J. Fuzzy Log. Intell. Syst.* **2024**, 24, 19–29. [CrossRef]
- 57. Hu, H.; Ren, Z. Optimizing Building Material Supplier Selection through Integrated Interval-Valued Intuitionistic Fuzzy Multi-Attribute Decision Making. *Int. J. Knowl.-Based Intell. Eng. Syst.* **2023**, 27, 489–502. [CrossRef]
- 58. Wan, S.-P.; Rao, T.; Dong, J.-Y. Time-Series Based Multi-Criteria Large-Scale Group Decision Making with Intuitionistic Fuzzy Information and Application to Multi-Period Battery Supplier Selection. *Expert Syst. Appl.* **2023**, 232, 120749. [CrossRef]
- 59. Majumdar, A.; Jeevaraj, S.; Kaliyan, M.; Agrawal, R. Selection of resilient suppliers in manufacturing industries post-COVID-19: Implications for economic and social sustainability in emerging economies. *Int. J. Emerg. Mark.* **2023**, *18*, 3657–3675. [CrossRef]
- 60. Song, J.; Leng, X.; Liu, Z. Green Supplier Selection Based on Sequential Group Three-Way Decision Making. *Mathematics* **2023**, 11, 4605. [CrossRef]
- 61. Wu, C.; Zou, H.; Barnes, D. A Supply Risk Perspective Integrated Sustainable Supplier Selection Model in the Intuitionistic Fuzzy Environment. *Soft Comput.* **2023**, 27, 15133–15151. [CrossRef]
- 62. Kahraman, C.; Cebi, S.; Oztaysi, B.; Cevik Onar, S. Intuitionistic Fuzzy Sets with Ordered Pairs and Their Usage in Multi-Attribute Decision Making: A Novel Intuitionistic Fuzzy TOPSIS Method with Ordered Pairs. *Mathematics* **2023**, *11*, 3867. [CrossRef]
- 63. Çakır, E.; Taş, M.A. Circular intuitionistic fuzzy decision making and its application. *Expert Syst. Appl.* **2023**, 225, 120076. [CrossRef]
- 64. Aungkulanon, P.; Atthirawong, W.; Luangpaiboon, P.; Chanpuypetch, W. Navigating Supply Chain Resilience: A Hybrid Approach to Agro-food Supplier Selection. *Mathematics* **2024**, *12*, 1598. [CrossRef]
- 65. Hsu, M.-C.; Lee, H.-S. Applying AHP-IFNs-DEMATEL in Establishing a Supplier Selection Model: A Case Study of Offshore Wind Power Companies in Taiwan. *Energies* **2023**, *16*, 4481. [CrossRef]
- 66. Puška, A.; Igić, S.; Prdić, N.; Dudić, B.; Stojanović, I.; Stošić, L.; Nedeljković, M. Application of Intuitionistic Fuzzy Approaches and Bonferroni Mean Operators in the Selection of Suppliers of Agricultural Equipment and Machinery for the Needs of the Agriculture 4.0 System. *Mathematics* 2025, 13, 2268. [CrossRef]
- 67. Dutta, P.; Konwar, A. Quintic fuzzy sets: A new class of fuzzy sets for solving multi-criteria decision-making problems under uncertainty. *Decis. Anal. J.* **2024**, *11*, 100449. [CrossRef]
- 68. Wu, X.; Zhu, Z.; Chen, G.; Pedrycz, W.; Liu, L.; Aggarwal, M. Generalized TODIM method based on symmetric intuitionistic fuzzy Jensen–Shannon divergence. *Expert Syst. Appl.* **2024**, 237, 121554. [CrossRef]
- 69. Ali, S.; Ali, A.; Azim, A.B.; Khan, A.S.; Awwad, F.A.; Ismail, E.A.A. TOPSIS method based on q-rung orthopair picture fuzzy soft environment and its application in the context of green supply chain management. *AIMS Math.* **2024**, *9*, 15149–15171. [CrossRef]

Sustainability **2025**, 17, 8008 29 of 29

70. Kong, D.; Tang, Y.; Zhang, H.; Bi, A. A stable matching method for technology trading with intuitionistic fuzzy multi-attribute information. *J. Intell. Fuzzy Syst.* **2023**, *45*, 12395–12409. [CrossRef]

- 71. Liu, L.; Zhu, Q.; Yang, D.; Liu, S. Extended multicriteria group decision making with a novel aggregation operator for emergency material supplier selection. *Entropy* **2023**, *25*, 702. [CrossRef] [PubMed]
- 72. Kahraman, C.; Cebi, S.; Cevik Onar, S.; Öztayşi, B. Pharmaceutical 3PL Supplier Selection Using Interval-Valued Intuitionistic Fuzzy TOPSIS. *Notes Intuitionistic Fuzzy Sets* **2022**, *28*, 361–374. [CrossRef]
- 73. Islam, M.M.; Arakawa, M. Integrated multi-criteria group decision-making model for supplier selection in an uncertain environment. *Cogent Eng.* **2022**, *9*, 2079220. [CrossRef]
- 74. Liu, M.; Wang, X.; Li, Y. Service supplier selection under fuzzy and stochastic uncertain environments. *J. Intell. Fuzzy Syst.* **2022**, 42, 1301–1315. [CrossRef]
- 75. Hwang, C.L.; Yoon, K. Multiple Attribute Decision Making: Methods and Applications; Springer: New York, NY, USA, 1981. [CrossRef]
- 76. Zadeh, L.A. Fuzzy sets. Inf. Control 1965, 8, 338–353. [CrossRef]
- 77. Atanassov, K.T. Intuitionistic fuzzy sets. Fuzzy Sets Syst. 1986, 20, 87–96. [CrossRef]
- 78. Işık, Ö.; Adalar, İ. A multi-criteria sustainability performance assessment based on the extended CRADIS method under intuitionistic fuzzy environment: A case study of Turkish non-life insurers. *Neural Comput. Appl.* **2025**, 37, 3317–3342. [CrossRef]
- 79. Lukić, R. Evaluation of trade performance dynamics in Serbia using ARAT and Rough MABAC methods. *Oeconomica Jadertina* **2024**, *14*, 34–44. [CrossRef]
- 80. Puška, A.; Nedeljković, M.; Pamučar, D.; Božanić, D.; Simić, V. Application of the new simple weight calculation (SIWEC) method in the case study in the sales channels of agricultural products. *MethodsX* **2024**, *13*, 102930. [CrossRef]
- 81. Shannon, C.E. A mathematical theory of communication. Bell Syst. Tech. J. 1948, 27, 379-423. [CrossRef]
- 82. Wu, X.; Shu, E.; Ye, D.; Zhou, S.; Sun, H. Study on green packaging diffusion in logistics enterprise clusters based on complex network evolutionary game. *J. Clean. Prod.* **2025**, 499, 145166. [CrossRef]
- 83. Özkurt Çokgüngör, H. Performance Appraisal of Iron and Steel Enterprises Listed on BIST: An ENTROPY-Based TOPSIS Approach. *J. Corp. Gov. Insur. Risk Manag.* **2024**, *11*, 168–179. [CrossRef]
- 84. Hsieh, H.-H.; Yao, K.-C.; Wang, C.-H.; Chen, C.-H.; Huang, S.-H. Using a Circular Economy and Supply Chain as a Framework for Remanufactured Products in the Rubber Recycling Industry. *Sustainability* **2024**, *16*, 2824. [CrossRef]
- 85. Fogt Jacobsen, L.; Pedersen, S.; Thøgersen, J. Drivers of and barriers to consumers' plastic packaging waste avoidance and recycling—A systematic literature review. *Waste Manag.* **2022**, *141*, 63–78. [CrossRef]
- 86. Qadir, A.; Abdullah, S.; Lamoudan, T.; Khan, F.; Khan, S. A New Three Way Decision Making Technique for Supplier Selection in Logistics Service Value Cocreation under Intuitionistic Double Hierarchy Linguistic Term Set. *Heliyon* **2023**, *9*, e18323. [CrossRef]
- 87. Sak, T.; Lialiuk, A.; Mylko, I.; Savchuk, Y. Brand Value on the Ukrainian Dairy Market: Innovative Assessment Methodology and Development of Marketing Strategies. *Econ.—Innov. Econ. Res. J.* **2024**, 12, 133–152. [CrossRef]
- 88. Toni, N. Supply Chain Sustainability and Financial Performance: The Role of E-Commerce, Digital Banking and Digital Marketing of SMEs. *Econ.—Innov. Econ. Res. J.* **2025**, *13*, 487–507. [CrossRef]
- 89. Akgül, Y. A Novel MCDM Framework for Evaluating Corporate Financial Performance: Evidence from the Turkish Insurance Sector. *J. Oper. Strateg. Anal.* **2025**, *3*, 65–79. [CrossRef]

Disclaimer/Publisher's Note: The statements, opinions and data contained in all publications are solely those of the individual author(s) and contributor(s) and not of MDPI and/or the editor(s). MDPI and/or the editor(s) disclaim responsibility for any injury to people or property resulting from any ideas, methods, instructions or products referred to in the content.