

发表科研论文

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Modeling linguistic intuitionistic fuzzy preference into the consensus and dissent framework of graph model for conflict resolution and its application

Guolin Tang^{a,*}, Tangzhu Zhang^{a,b}, Yingting Lv^b, Peide Liu^a

^a School of Management Science and Engineering, Shandong University of Finance and Economics, Jinan, Shandong, China

^b School of Law, Shandong University of Finance and Economics, Jinan, Shandong, China

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ABSTRACT

The intensification of water scarcity and pollution has elevated the strategic significance of cross-border water resources. Their transnational nature complicates ownership and use rights, leading to conflicts. The graph model for conflict resolution (GMCR) has proven effective in addressing strategic disputes. However, decision-makers' preferences, influenced by a complex interplay of cultural, economic, and political factors, are too intricate to quantify precisely in cross-border water resource conflicts. Besides, despite the importance of consensus being widely researched in the group decision-making field, its study within GMCR remains limited. To address these challenges, we develop a new consensus and dissent framework of GMCR with linguistic intuitionistic fuzzy preference relations (LIFPRs). As a qualification tool, LIFPRs composed of linguistic intuitionistic fuzzy numbers (LIFNs) can capture DMs' certainty, uncertainty, and hesitation. Specifically, we first propose a score function of LIFNs and some necessary definitions to model LIFPRs into GMCR. Then, we study the consensus and dissent framework of GMCR with LIFPRs in logical form. Additionally, we provide the corresponding matrix representation for future decision support system development. This study is applied to the Molding River conflict, suggesting that the Molding River Commission and China should engage in a comprehensive cooperative negotiation process.

1. Introduction

Economic and societal development, coupled with rapid population growth and the consequent increase in water demand, has led to increasingly severe water scarcity and pollution [1]. In this context, cross-border water resources have gradually become a strategic economic resource for countries, and their importance is self-evident. The transnational nature of cross-border water resources implies shared ownership among basin countries. However, governance systems are often complex due to overlapping claims regarding ownership, usage rights, and regulatory responsibilities. Unclear cross-border water rights and a lack of robust regulatory systems can lead some basin countries to adopt independent development models based solely on their own water needs, neglecting the overall ecological environment of the basin. This can harm the interests of other basin countries, resulting in ongoing conflicts [2]. Mild water conflicts can lead to political, economic, environmental, and civil disputes; severe ones can even cause

* Corresponding author.
E-mail address: peide.liu@sdufe.com (G. Tang), xingtinglv@163.com (T. Zhang), xingtinglv@163.com (Y. Lv), peide.liu@gmail.com (P. Liu).

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A new linguistic three-way decision model for multi-attribute group decision making problems under inconsistent group opinions

Yumei Wang^a, Peide Liu^{a,*}, Xiaoming Wu^b

^a Business School, Shandong Normal University, Jinan, Shandong 250009, China

^b School of Management Science and Engineering, Shandong University of Finance and Economics, Jinan, Shandong 250024, China

^c Faculty of Computer Science and Technology, Qilu University of Technology (Shandong Academy of Science), Jinan, Shandong 250024, China

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ABSTRACT

In real-world linguistic multi-attribute group decision-making (LMAAGDM) scenarios, conflicting attributes, differing opinions among stakeholders or factors such as decision costs and high risks often arise, making it challenging to find alternatives that simultaneously satisfy all attributes. It also involves multiple rounds of decision-making. However, the traditional LMAAGDM methods also aim to provide limited alternatives, resulting in binary decision outcomes where alternatives are either accepted or rejected. Such binary decision outcomes are overly stringent and did not align well with human cognitive habits. Moreover, inconsistency in group opinions often prevails in LMAAGDM scenarios. To address these issues, a relevant linguistic multiple attribute three-way group decision-making (LMAAGDM) approach is established. First, linguistic two measures derived from LMAAGDM are discussed, and a special linguistic three-way decision model is developed. Then, the LMAAGDM method is established based upon fuzzy equivalence clustering method and linguistic partitioned Dominant consensus score operator (LSDMSO) operator to address the inconsistency in group opinions. Lastly, the established LMAAGDM approach is applied to green supplier selection and subjected to sensitivity analysis and comparative analysis to demonstrate that the established LMAAGDM approach represents a significant advancement in handling inconsistency in group opinions, and also more conforming to typical decision-making scenarios in real world than the traditional LMAAGDM methods.

1. Introduction

As an essential component of the present decision-making science, multi-attribute decision making (MADM) means the decision-making process of selecting or ranking limited alternatives under the consideration of multiple attributes. MADM problems pervade various sectors,

linguistic preference of human being, natural language serves as the most appropriate medium for representing decision makers' sentiments. Utilizing linguistic (fuzzy) assessments proves to be more pragmatic than relying solely on numerical values in MADM problems. Therefore, this paper focuses on linguistic MADM (LMAAGDM) issues.

The current research in LMAAGDM is very rich, and many scholars and experts have proposed many different LMAAGDM methods from different perspectives, offering theories and different scenarios (Guo et al., 2021; Herrera-Medina et al., 2020; Wang et al., 2023; Zhang et al., 2023). For instance, Liu et al. (2022) proposed a group consensus method based on evidence reasoning. Zhang et al. (2023) built a group consensus method around this evidence and robust optimization. Wang et al. (2024) established a LMAAGDM method from the perspective of decision makers' psychological behavior. The above LMAAGDM methods primarily aim to rank or prioritize limited alternatives, resulting in binary decision outcomes where alternatives are either accepted or rejected. However, such decision outcomes are often too

* Corresponding author.
E-mail address: peide.liu@gmail.com (P. Liu), xiaomingwu@sdufe.com (X. Wu).

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Full length article

A novel graph model for resolving power-asymmetric conflicts: Application in hierarchical diagnosis and treatment systems

Guolin Tang^a, Tangzhu Zhang^a, Francisco Chiclana^a, Peide Liu^{a,*}

^a School of Management Science and Engineering, Shandong University of Finance and Economics, Jinan, Shandong, China

^b Institute of Artificial Intelligence, School of Computer Science and Information, De Mingde University, Liaoning, CN

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ABSTRACT

As Chinese society undergoes rapid aging and urbanization, the existing medical service system faces significant challenges. Including unequal resource distribution, a shortage of high-quality resources, and inefficient allocation. To address these issues, the hierarchical diagnosis and treatment process (HDTs) has been introduced to optimize medical resource allocation and utilization. However, implementing HDTs encounters complex conflicts of interest among multiple decision-makers (DMs), compounded by ambiguity, uncertainty, and power asymmetry. This paper proposes the power-asymmetric additive graph model for conflict resolution (PAAGMCR), a versatile tool that integrates qualitative and quantitative methods to address stakeholder conflict in HDTs implementation in Shandong, China. The optimal solution can be identified using PAAGMCR. The Shandong Provincial Government should standardize medical treatment processes in tertiary hospitals, invest in grassroots medical facilities, allocate funds for public awareness campaigns, and encourage patients to seek local treatment at the grassroots level. Tertiary hospitals should collaborate with grassroots hospitals to utilize ambulances for equipment upgrades and workforce training. Patients and their families should adhere to HDTs principles and make rational healthcare decisions. Furthermore, this study outlines an evolutionary path from the initial to the optimal state, offering theoretical support for resolving real-world conflicts. Finally, strategic recommendations are provided according to the analysis results of the conflict to guide DMs in implementing HDTs effectively.

1. Introduction

The allocation of medical resources in China exhibits a pronounced "inverted pyramid" structure, with tertiary hospitals concentrating the majority of resources, including advanced equipment, highly skilled medical personnel, and extensive clinical expertise [1]. In contrast, primary healthcare institutions face a relative lack of resources. This tertiary-centric diagnostic and treatment model can only rely on high-quality medical resources for common and frequent ailments but also increases patients' economic and financial burdens. Simultaneously, primary healthcare institutions struggle with underutilized resources and declining patient patronage [2]. This imbalance, coupled with the growing medical demands of an aging population, hampers the operational efficiency of China's healthcare system and significantly constrains the pursuit of high-quality development in the health sector.

To address these challenges, the Chinese government issued the "Guiding Opinions of the General Office of the State Council on Advancing the Establishment of a Hierarchical Diagnosis and Treatment System" (2015 [3]). This policy emphasizes prioritizing the redistribution of high-quality medical resources, promoting the vertical flow of healthcare services, and improving the efficiency and overall benefits of resource utilization. Its goal is to establish an organized medical service framework that positions primary healthcare institutions as the initial point of contact, facilitates bidirectional referrals, differentiates treatment for acute and chronic conditions, and ensures vertical integration across various levels of healthcare providers [4]. The hierarchical diagnosis and treatment system (HDTs) is recognized as a pivotal mechanism for optimizing resource allocation and ultimately improving the population's health outcomes [5].

Since the inception of the HDTs in China, Shandong Province has implemented tailored strategies to promote its development. The Implementation Opinions of the General Office of the Shandong Provincial People's Government on Promoting the Establishment of the HDTs [6] outlined a phased roadmap, initiating pilot projects in selected prefecture-level cities in 2015, expanding the pilot regions in 2016, establishing the HDTs and

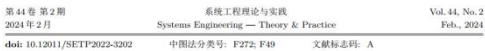
* Corresponding author.
E-mail address: peide.liu@gmail.com (G. Tang), xingtinglv@163.com (T. Zhang), chiclana@sdufe.com (F. Chiclana), peide.liu@gmail.com (P. Liu).

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碳配额交易机制下竞争企业低碳技术扩散——基于复杂网络的演化博弈分析

刘培德, 李西娜, 李佳路

(山东财经大学 管理科学与工程学院, 济南 250000)

摘要 碳配额交易机制被认为是应对全球气候变化最有效的碳减排市场激励手段。为了探究此机制下企业生产、减排和碳交易的最终决策以及低碳技术的扩散度, 构建了低碳技术-减排技术两种减排博弈模型, 分析各参数对最优决策的影响; 同时, 以 WS 小世界网络为网络, 设计演化规则, 利用数据仿真探索各要素对低碳技术扩散的联动效应。结果表明: 微观层面, 碳配额和竞争强度共同影响减排水平, 碳价格和碳交易量提升无益, 但产量与碳配额正相关, 与竞争强度负相关; 宏观层面, 低碳技术的扩散程度取决于企业间竞争强度以及碳配额水平, 碳配额的降低以及企业间竞争强度的减弱都能够促进低碳技术的扩散, 与补贴机制相比, 碳配额交易机制可实现经济效益与环境效益的“双赢”, 即碳配额交易机制能够促进低碳技术扩散程度并令企业获得更高利润。

关键词 碳配额交易; 低碳技术扩散; 复杂网络; 演化博弈

Low carbon technology diffusion of competitive firms under cap and trade mechanism — Evolutionary game analysis based on complex network

LIU Peide, LI Xina, LI Jialu

(School of Management Science and Engineering, Shandong University of Finance and Economics, Jinan 250000, China)

Abstract Cap and trade is considered to be the most effective market incentive mechanism for carbon emission reduction to deal with global climate change. In order to study the optimal decision-making of production, emission reduction and carbon trading as well as the diffusion of low-carbon technology under this mechanism, we build two emission reduction game models of low-carbon technology and traditional technology under cap and trade mechanism for competitive firms. The impact of various parameters on the optimal decision-making is analyzed; at the

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作者简介: 通信作者: 刘培德 (1966~), 男, 汉, 教授, 研究方向: 决策理论与优化方法, E-mail: liupd@sdufe.edu.cn; 李西娜 (1995~), 女, 汉, 博士研究生, 研究方向: 博弈论与供应链管理, E-mail: LXina1001@126.com; 李佳路 (1987~), 男, 汉, 副教授, 研究方向: 大数据信息下的供应链管理, 行为运营管理, E-mail: ljz0005@mail.com.cn

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Research Article

An Optimized Association Rules Mining Framework for Chinese Social Insurance Fund Data Auditing

Wu Xinguo^a and Du Shengrong^a

^aSchool of Management Science and Engineering, Shandong University of Finance and Economics, Jinan 250014, China

Correspondence should be addressed to Wu Xinguo; xinguo@sufe.edu.cn

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Association rules mining with the Chinese social insurance fund dataset can effectively discover different kinds of errors, irregularities, and illegal acts by providing evidence with relationships among the terms and the error types, auditing quality and efficiency. However, traditional positive and negative association rules (PNAR) mining algorithm inevitably produces too many meaningless or correlated error rules when those two types of rules are mined simultaneously, which brings a huge challenge to auditors in saving human resources. Aimed to reduce the quantity of irrelevancy (NAR) rules mining according to rules, this paper first proposes an improved PNAR mining algorithm with maximum correlation and triple confidence knowledge to control the mined rule number by narrowing the range of confidence settings. Then, a novel mining algorithm based on the induction relation (i.e., the rule association and consequent) is given to remove these redundant rules. After that, the proposed optimized PNAR mining approach is applied to the Chinese social insurance fund dataset starting with rule feature relevance factor mining using the fish scale. The experiment results with different datasets show that the proposed framework not only can extract efficient and interesting rules extraction but also has better performance than traditional approaches in both accuracy and efficiency, reducing the number of redundant PNARs by over 73.0% with experimental datasets and average 36.9% with auditing data mining, respectively.

1. Introduction

As has been shown that auditing plays a paramount role in the process of realizing effective national governance, ensuring healthy and scientific social and economic development around the world [1, 2]. In the era of big data, most governments and companies have accumulated a large amount of management and innovation data with the development of information technology. Similarly, heterogeneous and various types of big data are creating serious troubles in the auditing field since it is extremely difficult and cumbersome to manually find accounting irregularities and financial fraud information from the data itself at the surface level [3, 4]. As an example, in 2022, nearly twenty-three million declarations, payments, receipts, and other records were submitted to the Social Insurance Fund Information Center of a province in China every month,

containing abundant information along with errors, irregularities, and illegal acts [5]. For auditors, it is a challenging task to identify these abnormal economic behaviors from the huge amount of data currency. Furthermore, traditional audit methods only analyze data accuracy and integrity without discovering the hidden relationship between variables, resulting in low quality and efficiency in auditing [6, 7]. With the change of objectives, tasks, complexity, and modes of national governance, the strategies and methods for auditing should also change accordingly, therefore, tax-raising fraud cases [8–10]. Many studies [6, 8–11] have proposed several association rule mining methods aimed at capturing the relationships among fields in audit databases, helping the auditors' decision making with accurate information, including not only positive association rules (PNARs) but also negative association rules (NARs), simultaneously. In particular, those NARs provide richer



Innovative ensemble system based on mixed frequency modeling for wind speed point and interval forecasting

Wendong Yang^{a,b}, Mengying Hao^a, Yan Hao^{a,c,*}

^aSchool of Management Science and Engineering, Shandong University of Finance and Economics, Jinan, Shandong 250014, China

^bAcademy of Marine Economics and Management, Shandong University of Finance and Economics, Jinan, Shandong 250014, China

^cSchool of Mathematics and Computer Application Technology, Jinan University, Jinan, Shandong 271755, China

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ABSTRACT

Wind speed forecasting can improve wind energy utilization and is thus highly significant for wind power systems; however, it is a challenging problem. Forecasting techniques from previous research were mainly developed using single-frequency-based time series modeling, which has recently become a popular approach. Although mixed-frequency-based modeling has significant potential, research applying this approach to wind speed forecasting is almost nonexistent. To fill this research gap, we developed an innovative ensemble system based on mixed frequency modeling to perform wind speed point and interval forecasting, comparing data preprocessing, robust frequency modeling, and ensemble forecasting modules. Unlike the methods used in most previous studies, this system exploits the tremendous potential of mixed frequency data. In addition, a multi-objective optimization-based ensemble forecaster was devised to provide deterministic and uncertain information regarding future wind speed. Furthermore, data preprocessing based on different strategies was applied to improve the performance of multiple forecasting models. An empirical study based on ten wind farms shows that the system outperforms benchmark techniques and can be employed for data monitoring and analysis in wind farms or other fields. © 2022 Elsevier Inc. All rights reserved.

1. Introduction

With the rapid development of the global economy, the utilization of fossil energy continues to increase, causing serious problems such as global warming. To bolster economic development and protect the environment, the use of renewable energy has become increasingly common. In recent years, renewable energy has occupied an increasing proportion of the global energy supply. Wind energy, which is among the cleanest renewable energy sources, is considered to be an effective alternative to fossil fuel energy. However, the randomness and nonlinearity of wind speed directly affect the utilization of wind energy [1]. An effective wind speed forecasting model can capture future wind speed changes, which is necessary to ensure adequate and efficient wind power system operation.

* Corresponding author.

E-mail address: yanhao@sufe.edu.cn (Y. Hao).

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A multi-objective q-rung orthopair fuzzy programming approach to heterogeneous group decision making

Guolin Tang^a, Xiaowei Gu^a, Francisco Chiclana^{a,b}, Peide Liu^{a,c,*}, Kedong Yin^a

^aSchool of Management Science and Engineering, Shandong University of Finance and Economics, Jinan, Shandong, China

^bSchool of Computing, University of Kent, Canterbury, UK

^cInstitute of Artificial Intelligence, School of Computer Science and Information, De Montfort University, Leicester, UK

^dAcademy Research Institute on Data Science and Computational Intelligence, University of Granada, Spain

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ABSTRACT

In addition to heterogeneous multi-criteria group decision making (MGDM) problems with incomplete weights and q-rung orthopair fuzzy (qROF) truth degrees, where many kinds of criteria values, i.e., crisp values, intervals, trapezoidal fuzzy values, hesitant fuzzy values and qROF values (qROFVs), and multiple types of interaction exist, i.e., positive synergistic interaction, negative synergistic interaction and independence, a novel multi-objective qROF programming approach is proposed. In particular, in order to globally explore the interaction among criteria, Choquet-based interval dominance degrees are developed based on the technique for order performance by similarity to ideal solution (TOPSIS) and the Choquet integral. Then, the qROF Choquet-based group consistency index (qROFGCI) and the qROF Choquet-based group consistency index (qROFGCI) are defined. Next, to derive optimal 2-additive fuzzy measures on the criteria set and optimal experts' weights, a new multi-objective qROF mathematical programming model is established by minimizing the qROFGCI and maximizing the qROFGCI. Subsequently, an algorithm based on the adaptive non-dominated sorting genetic algorithm III (NSGA-III) is designed to solve the established model. Afterwards, the Choquet-based overall relative dominance degree of the alternatives are used to obtain their preferred ordering. Finally, the effectiveness and advantage of the proposed approach is verified using four real cases concerning the evaluation of social customers.

1. Introduction

Social commerce (s-commerce) refers to the use of social media and Web 2.0 tools to enhance the interactions of individuals on the Internet in order to support consumers' acquisition of products and services [5]. In recent years, with the increasing maturity of s-commerce, increasingly more consumers, especially the new generation, have taken part in s-commerce [14]. However, due to the virtual and anonymous nature of s-commerce, consumers cannot see merchants and commodities [35]. There is also a time asymmetry between payment and shipment, which makes it possible for merchants to commit fraud during transactions [3]. For these reasons, consumers may suffer from high credit risks, which would negatively affect their purchase intention. With the help

* Corresponding author.

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A Multiattribute Group Decision-Making Method With Probabilistic Linguistic Information Based on an Adaptive Consensus Reaching Model and Evidential Reasoning

Peide Liu^a, Member, IEEE, Ying Li, Xiaochong Zhang^a, and Witold Pedrycz^a, Life Fellow, IEEE

Abstract—This article proposes a new multiattribute group decision-making (MAGDM) method with probabilistic linguistic information that considers the following three aspects: an allocation of ignorance information, a realization of group consensus, and an aggregation of assessments. To allocate ignorance information, an optimization model based on minimizing the distances among experts is developed. To measure the consensus degree, a consensus index that considers the information granules of linguistic terms (LTs) is defined. On this basis, a suitable optimization model is established to realize the group consensus adaptively by optimizing the allocation of information granules of LTs with the particle swarm optimization (PSO) algorithm. With an objective to reduce the information loss during aggregation phases, the process of generating comprehensive assessments of alternatives with the evidential reasoning (ER) algorithm is provided. Therefore, a new method is developed based on the adaptive consensus reaching (ACR) model and the ER algorithm. Finally, the applicability of the proposed method is demonstrated by solving a selection problem of a financial technology company. Comparative analyses are conducted to show the advantages of the proposed method.

Index Terms—Evidential reasoning (ER) algorithm, information granulation (IG), multiattribute group decision making (MAGDM), probabilistic linguistic term sets (PLTSs).

The aim of MAGDM is to find the best alternative or obtain the ranking order of alternatives according to the assessments provided by a group of experts regarding multiple attributes. Compared with multiattribute decision making (MADM) with a single expert, MAGDM is conducive to gathering the wisdom of experts in different fields and understanding problems from different perspectives, to improve rationality in decision making. Thus, many studies have been conducted to address MAGDM problems [5], [7], [8], [11]–[17], [37], [50]. Since the process in MAGDM is centered on humans, who arrive with their inherent subjectivity, impression, and vagueness in the articulation of opinions, it is advantageous to express evaluations with linguistic information [2].

To effectively express the qualitative linguistic evaluations of experts, several linguistic representation models have been proposed in the existing literature: 1) single linguistic terms [43]; 2) hesitant fuzzy linguistic terms (HFLTs) [50] and unbalanced linguistic assessments (ULAs) [3]; and 3) linguistic distribution assessments (LDAs) [55] and probabilistic linguistic term sets (PLTSs) [25]. Compared with the first two linguistic representation models, the third model can not only express the hesitation information with several linguistic terms (LTs) but also reflect the importance of each LT with a probability. Moreover, PLTSs have an advantage over LDAs when addressing complex situations where partial ignorance exists because they allow the sum probabilities of all LTs to be less than 1. Thus, PLTSs exhibit great flexibility and comprehensiveness in expressing hesitant and ignorant qualitative linguistic evaluations.

With the emergence of PLTSs, they have been widely applied to practical MAGDM problems, such as venture capital [4], personalized restaurant recommendations [26], [51], selection of financial technologies [22], and emergency rescue planning [56]. Moreover, a number of relevant probabilistic linguistic group decision making (PLGDM) methods have been developed. These methods have focused on the following studies:

1) *Allocation of Ignorance Information*: The existence of ignorance information is not rare in practical PLGDM problems due to experts' insufficient knowledge or the complexity of the decision information. According to the review of [23], the allocation of ignorance information of PLTSs can be divided into five categories according to the

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A mathematical programming method based on prospect theory for online physician selection under an R-set environment

Guolin Tang^a, Xiaoyang Zhang^a, Baoying Zhu^a, Hamidreza Seifi^b, Francisco Chiclana^{c,d}, Peide Liu^a

^a School of Management Science and Engineering, Shandong University of Finance and Economics, Shandong, China
^b Department of Industrial Engineering, Iran University of Science and Technology, Tehran, Iran
^c Institute of Artificial Intelligence, De Montfort University, Leicester, UK
^d Publication Research Institute on Data Science and Computational Intelligence, University of Granada, Granada, Spain

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ABSTRACT

This study develops an R mathematical programming method for multiple attribute group decision-making (MAGDM) problems with assessment values of alternatives and truth degrees of pairwise alternative comparison represented by R sets while the decision maker holds subjective bounded rationality. First, a novel order multiplicative operation and defuzzification of R sets are proposed to allow the use of R sets in MAGDM problems. Subsequently, based on prospect theory and R sets, a new technique is proposed to compute the de-fuzzified overall prospect value of an alternative by simultaneously considering the positive ideal solution (PI) and negative ideal solution (NI). Additionally, the R-group consistency index (R-GCI) and R-group inconsistency index (R-GII) are defined using the individual overall prospect values of alternatives. The decision makers' weights, utilities weights, PI, and NI are estimated by establishing a novel R mathematical programming model, which is solved by the external archive-based constrained state transition, while the collective overall prospect values are computed to derive the final ranking order of alternatives. Thus, a novel R-MAGDM method is developed to solve MAGDM. A practical instance concerning online physician selection is provided with the corresponding numerical and comparative analyses to verify the applicability, validity, and superiority of the developed method.

1. Introduction

Computing, choosing, ranking, or sorting alternatives are common decision-making activities that often occur in everyday life. Real-life decision problems, such as green logistic risk assessment [1], stock investment selection [2], and service quality evaluation [3], generally involve multiple assessment attributes and require consensus decision makers (DMs), which makes multi-attribute group decision-making (MAGDM) relevant and worth investigating. Often, in MAGDM problems, the available data are not precise, but rather ambiguous or vague. The concept of a fuzzy set (FS) was proposed by Zadeh [4] to model these data, the important issue when employing FS is to handle the reliability or unavailability of data for the problem. Therefore, many different FSs have been introduced, such as hesitant FS (HFS) [5], intuitionistic FS (IFS) [6], grey softset FS (g-ROFS) [7], 2-number FS [8], hesitant fuzzy linguistic term set (HFLTS) [9], probabilistic

linguistic term sets (PLTS) [10], and flexible linguistic expression (FLE) [11]. Nevertheless, in certain situations, the available imprecise data may also be related to future events or be derived from unstable sources and consequently exhibit some degree of uncertainty and/or risk. To address this issue, that is, to describe the risk of FS due to risk factors, the F-number concept [12] was introduced. In F-numbers, risk modeling of the FS considers the variability of the domain variable, but not the variability of its membership function (MF). In addition, only one source of risk factors associated with FS is considered. Thus, Seifi et al. [13] presented the concept of R-sets, which generalizes FS, to describe the error and risk associated with MFs by modelling the risk related to future events and information sources. Table 1 lists the comparisons of different fuzzy models with R-sets. Investigating Table 1, it is clear that the R-set is more capable of addressing the various uncertainties involved in the physician selection problem although its parameters might not be used in a real-world problem.

* Corresponding author.

E-mail address: peide.liu@gmail.com (P. Liu).

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A dynamic large-scale multiple attribute group decision-making method with probabilistic linguistic term sets based on trust relationship and opinion correlation

Fei Teng^a, Chuanfuo Du, Mengjiao Shen, Peide Liu

^a School of Management Science and Engineering, Shandong University of Finance and Economics, Jinan, Shandong 250014, China

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ABSTRACT

Dynamic large-scale multiple attribute group decision-making (DLMGDM) is ubiquitous in many areas of the real world. It is composed of large numbers of decision makers, several continuous preference alternatives and attributes, and changes with time. Given the characteristics involved in decision-making elements and the uncertainty of probabilistic linguistic term sets (PLTSs) in modelling uncertainty and complexity of decision makers' subjective opinions, this paper constructs a probabilistic linguistic DLMGDM method. First of all, a dynamic weight determination model based on trust relationships and individual conflicts between decision makers is proposed to obtain current dynamic weights of decision makers. Then, a comprehensive hierarchical clustering method that divides large numbers of decision makers into several subgroups is constructed based on cases clustering constraints. Moreover, some probabilistic linguistic extended evidential power aggregation operators are proposed to aggregate PLTSs. These operators can appropriately handle the extreme PLTSs and fully consider the role of incomplete probabilistic distributions in PLTSs. In addition, a dynamic decision-making method based on PROMETHEE is developed to determine the final priority order of alternatives according to preferences between alternatives over several periods. Lastly, a case study for supply chain finance risk assessment for several firms in Chinese financial application industry is utilized to illustrate the practicality and effectiveness of the probabilistic linguistic DLMGDM method. Furthermore, the comparative analysis with some other existing methods and the sensitivity analysis are made to verify its advantages.

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1. Introduction

Multiple attribute decision making, as a pervasive human phenomenon, has penetrated in all the fields of real life and has formed a decision-making framework for assisting decision maker in making proper decision and maximizing the economic and social efficiency [1,2,3]. With interest subjects diversity present situation, public participation consciousness began to awaken and ascend, and lots of decision makers participate in the decision-making process, hence arousing the desire to explore multiple attribute large-scale group decision making (MAGDM) [2,7,10,30,40]. Further, with the continual variation of social environments and an endless stream of unstructured factors, the practical decision-making problems are full of com-

* Corresponding author.

E-mail address: 1395510568@163.com (F. Teng).

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Temporal-spatial evolution of green total factor productivity in China's coastal cities under carbon emission constraints

Peide Liu^a, Baoying Zhu

^a School of Management Science and Engineering, Shandong University of Finance and Economics, Jinan, Shandong 250014, China

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ABSTRACT

Coastal cities are the strategic core area of China's economic growth. Measuring and understanding green total factor productivity (GTFP) growth in coastal cities is an essential prerequisite for achieving high-quality development (HQD). This paper aims to measure the accurate GTFP growth in China's coastal cities and group its temporal-spatial evolution. First, a three-stage frontier analysis model is constructed to calculate the accurate GTFP growth with the effects of external environmental factors and statistical errors eliminated. In the context of the "3060" double carbon target, carbon emission becomes a challenge to the HQD of the coastal cities. To ensure GTFP growth under the carbon emission constraints, carbon emissions are considered as one of the undesired outputs. In this study, the temporal-spatial evolution of the GTFP index and its spatial effect are further explored using local density estimation and spatial heterogeneity. The empirical results show that (1) the adjusted GTFP index was declining the effects of environmental factors and statistical errors is significantly different from the original results. The GTFP index of coastal cities is underestimated without eliminating the effects of environmental factors and statistical errors. (2) There are no significant differences in the regional distribution of GTFP growth in coastal cities, with cities with faster GTFP growth preferring production factors from adjacent cities and creating a spillover effect. Finally, policy recommendations are listed in these findings are given.

1. Introduction

China has a continuous coastline of about 18,000 km, which provides a solid foundation for China's remarkable achievements since the Chinese government carried out the reform and opening up policy. The coastal regions are strategic locations for China, supporting 40% of the population and contributing 60% of China's economic activity within less than 10% of the country's land area. However, the outstanding achievements of the coastal regions have arrived at the cost of excessive consumption of fossil fuels such as coal, oil, and natural gas, which has caused many environmental pollution problems (Liu and Peng, 2021). The burning of fossil fuels inevitably produces air pollutants such as nitrogen dioxide (NO₂), sulfur dioxide (SO₂), carbon monoxide (CO), and volatile organic compounds (VOCs), as well as carbon dioxide (CO₂), one of the leading greenhouse gases (Li et al., 2020). The 2021 Greenhouse Gas Initiative issued by the World Meteorological Organization points out that from 1990 to 2020, the warming effect of long-lived greenhouse gases on the climate has increased by 47%. Carbon dioxide accounts for about 80% of this increment (Friedlingstein et al., 2013).

On September 20, 2020, the Chinese government announced the "2060" double carbon target: striving to have CO₂ emissions peak before 2030 and achieve carbon neutrality before 2060. In this context, a development pattern based on resource conservation is no longer appropriate for China's coastal regions, and it is necessary to find a new development pattern that balances economic development and carbon emissions in coastal areas. The report of the 19th National Congress of the Communist Party of China put forward the concept of high-quality development (HQD), pointing out that China's economy is at a critical stage of shifting from a large number of copies of production factors (Feng et al., 2021). In the context of the "2060" double carbon target, the HQD of coastal regions has been closely linked to the carbon emissions in the following two aspects. First, the "2060" double carbon target is an inherent requirement for the HQD. Adjusting the energy structure is a critical approach to the "2060" double carbon target. Increasing the proportion of

* Corresponding author.

E-mail address: peide.liu@gmail.com (P. Liu).

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A new integrated multi-attribute decision-making approach for mobile medical app evaluation under q-rung orthopair fuzzy environment

Guolin Tang^a, Yongxuan Yang^a, Xiaowei Gu^a, Francisco Chiclana^{a,c}, Peide Liu^{a,c}, Fubin Wang^a

^a School of Management Science and Engineering, Shandong University of Finance and Economics, Shandong, China
^b School of Computing, University of Kent, Canterbury, UK
^c Institute of Artificial Intelligence, De Montfort University, Leicester, UK
^d Publication Research Institute on Data Science and Computational Intelligence, University of Granada, Granada, Spain

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ABSTRACT

Mobile medical app evaluation can be modelled as a multi-attribute decision-making (MADM) problem with multiple assessment attributes. Due to the increasing complexity and high uncertainty of decision environments, numerical numbers and/or traditional fuzzy sets may not be appropriate to model attributes information of mobile medical apps. In addition, heterogeneous relationships are often observed among different attributes in various practical decision situations. To deal with these issues, a group orthopair fuzzy (q-ROF) MADM approach, which is a very powerful tool for describing grey information occurring in real decision circumstances, is proposed to handle decision-making problems in medical app evaluation. In particular, group orthopair fuzzy numbers (q-ROFNs) are first applied to better express the preference information and experts' assessment information. Then, q-ROFNs are extended by combining with Thompson method, resulting in the q-ROF Thompson integral (q-ROFTI). This integral can capture comprehensiveness, robustness and/or independent observations among the members and is superior to existing operators in q-ROFNs. Next, based on the best-worst method (BWM) and BWM values, two optimization models are constructed to objectively identify optimal fuzzy measures on the attributes set. Finally, a novel integrated q-ROF MADM approach is proposed and its comparison procedure is presented and illustrated with its application in the problem of mobile medical app evaluation. A perspective analysis is carried out to demonstrate the validity, rationality, robustness and superiority of the developed method.

1. Introduction

While providing convenience for personal health, a mobile medical app is also accompanied by corresponding management problems, such as insufficient user privacy protection, difficult verification of information authenticity, high risk of misdiagnosis diagnosis and false medical advertisements, etc., which lead to poorer user experience and seriously impact the reputation of doctors and hospitals. In order to enhance the competitiveness and better service users, mobile medical app evaluation is necessary. Mobile medical app evaluation can be modelled as a multi-attribute decision-making (MADM) problem with multiple assessment attributes, including functionality, safety, interface and reliability. In recent years, several researched have applied MADM-based methodologies to mobile medical app evaluation and selection issues. For example, Li (2018) used the Delphi method and AHP (Analytic

Hierarchy Process) model to evaluate mobile medical app. Li et al. (2021) integrated the TOPSIS (Technique for Order Preference by Similarity in Ideal Solution) and AHP method for the medical and health app user experience evaluation. Considering the complexity of objective ratings and distributions from internal or external uncertainty and ambiguity, it is more realistic for experts to describe assessment information using fuzzy numbers (FNs) (Guo et al., 2020; Vargay et al., 2022; Sushilakshmi, 2021). Based on this observation, Xu (2018) proposed an integrated approach for evaluating mobile medical app based on the AHP model and fuzzy comprehensive evaluation method. In the existing fuzzy mobile medical app evaluation research, the traditional FNs serve as a tool to represent uncertain information. However, in the real world, for mobile medical app evaluation problems, most of the assessment detailed information is unknown and there exists a high degree of uncertainty. Consequently, it is insufficient to describe

* Corresponding author.

E-mail address: X.Guo@kent.ac.uk (X. Guo), peide.liu@gmail.com (P. Liu), 181106091@gmail.com (F. Wang).

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A novel ensemble model based on artificial intelligence and mixed-frequency techniques for wind speed forecasting

Wendong Yang^{a,b}, Zhirui Tian^{b,c}, Yan Hao^c

^a School of Management Science and Engineering, Shandong University of Finance and Economics, Jinan, Shandong 250003, China
^b School of Statistics, Anhui University of Finance and Economics, Jishui, Anhui 160205, China
^c Institute of Marine Economy and Management, Shandong University of Finance and Economics, Jinan, Shandong 250034, China

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ABSTRACT

Wind speed forecasting is of prime importance for wind power generation, which can bring tremendous economic, social and environmental benefits. However, previous wind speed forecasting studies mostly focused on proposing hybrid or ensemble models by combining different methods while ignoring the significant opportunities brought by the use of big data. In particular, the statistical and applications of mixed-frequency data modeling for wind speed forecasting are almost nonexistent, so some valuable cross season and time series to be mined in depth. In this context, a novel ensemble model, which successfully combines mixed-frequency data into the field of wind speed forecasting and constructs the matrix of mixed-frequency models and artificial intelligence methods, is developed for wind speed forecasting. More specifically, the original wind speed data are preprocessed by an advanced data decomposition technique to effectively tackle the challenges caused by noise and capture the main characteristics that existed in the original data. Moreover, some artificial intelligence models and mixed-frequency models are designed as sub-models and employed to predict future wind speed changes. These models aim to make full use of the informative content in various frequency and mixed-frequency data. Furthermore, a new ensemble forecasting model is developed by combining the power of kernel-based extreme learning machine and multi-objective optimization to ensemble the results output by the sub-models. Various experiments and discussions are designed using four seasons of data, and the proposed model achieves excellent forecasting results. For example, the mean absolute percentage errors of the proposed model are 4.4288%, 6.5555%, 5.2749% and 3.8627% for wind speed forecasting during the four seasons, proving the capability of the developed model for the intersection and nonintersection provided by this study from different perspectives.

1. Introduction

This section provides the motivation of this study; a literature review and the research content, innovation and main contributions of the study.

1.1. Motivation

Energy consumption, caused by rapid economic development, has led to the global overutilization of nonrenewable resources, which has led to a significant rise in greenhouse gas emissions and irreversible negative effects on the environment. Low-carbon and renewable energy

is playing an increasingly irreplaceable role worldwide and can play an important role in environmental protection. Wind energy, as clean, sustainable, and renewable energy, is attracting worldwide attention [1] and is considered one of the practical alternatives to traditional fossil fuel. Recent studies have pointed out that 20% of the global electricity supply can be provided via wind energy in 2030 [2]. Wind power and wind speed have a cubic ratio [3], in which means that a small change in wind speed will produce a large amount of wind power. Therefore, wind speed has prime importance with respect to the generation of wind power.

However, the inherent variability of wind speed [4] brings great difficulties in the management of wind power systems. Therefore, how

* Corresponding author.
 E-mail address: yangwendong@sdufe.edu.cn (W. Yang).

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Interval type-2 fuzzy programming method for risky multicriteria decision-making with heterogeneous relationship

Guolin Tang^{a,b}, Jianpeng Long^a, Xiaowei Gu^a, Francisco Chiclana^{a,c}, Peide Liu^{b,d}, Fubin Wang^e

^a Institute of Marine Economics and Management, Shandong University of Finance and Economics, Jinan, Shandong, China
^b School of Management Science and Engineering, Shandong University of Finance and Economics, Jinan, Shandong, China
^c School of Automation, Central South University, Changsha, China
^d School of Computing, University of Kent, Canterbury, UK
^e Institute of Artificial Intelligence (IAI), School of Computer Science and Informatics, De Montfort University, Leicester, UK
^f Department of Computer Science and Artificial Intelligence, University of Granada, Granada, Spain

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ABSTRACT

We propose a new interval type-2 fuzzy (IT2F) programming method for risky multicriteria decision-making (MCDM) problems with IT2F truth degrees, where the criteria exhibit a heterogeneous relationship and decision-makers behave according to bounded rationality. First, we develop a technique to calculate the Banzhaf-based overall perceived utility values of alternatives based on 2-additive fuzzy measures and regret theory. Subsequently, considering pairwise comparisons of alternatives with IT2F truth degrees, we define the Banzhaf-based IT2F risky consistency index (BRTFCRI) and the Banzhaf-based IT2F risky inconsistency index (BRTFRI). Next, to identify the optimal weights, an IT2F programming model is established based on the concepts that BRTFCRI must be minimized and must not exceed the BRTFRI using a fixed IT2F set. Furthermore, we design an effective algorithm using an external archive-based constraint state transition algorithm to solve the established model. Accordingly, the ranking order of alternatives is derived using the Banzhaf-based overall perceived utility values. Experimental studies pertaining to investment selection problems demonstrate the state-of-the-art performance of the proposed method, that is, its strong capability in addressing risky MCDM problems.

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1. Introduction

Multicriteria decision-making (MCDM) has been extensively applied to different fields, such as postgraduate course assessment [10], investment evaluation [13,19], research and development project selection [20], and comprehensive logistics distribution center location selection [7]. The traditional linear programming technique for multidimensional analysis of preference (LINMAP), which was proposed by Srinivasan and Schicker [31], is currently one of the most well-known MCDM approaches in modern decision theory because of its two advantages:

* Corresponding author.
 E-mail addresses: pengliu@cs.kent.ac.uk (G. Tang), xiaowei.gu@sdufe.edu.cn (X. Gu), chiclana@iaai.cs.kent.ac.uk (F. Chiclana), peide.liu@kent.ac.uk (P. Liu), wfbwang@cs.kent.ac.uk (F. Wang).

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A novel machine learning-based electricity price forecasting model based on optimal model selection strategy

Wendong Yang^{a,b}, Shaolong Sun^{c,d}, Yan Hao^e, Shouyang Wang^{a,c,g}

^a School of Management Science and Engineering, Shandong University of Finance and Economics, Jinan, Shandong 250003, China
^b Institute of Marine Economy and Management, Shandong University of Finance and Economics, Jinan, Shandong 250034, China
^c School of Management, Xiamen University, Xiamen, Fujian 361021, China
^d Business School, Shandong Normal University, Jinan, Shandong 250014, China
^e Academy of Mathematics and System Science, Chinese Academy of Sciences, Beijing, 100084, China
^f School of Economics and Management, University of Chinese Academy of Sciences, Beijing, 100084, China
^g Center for Forecasting Science, Chinese Academy of Sciences, Beijing, 100084, China

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ABSTRACT

Current electricity price forecasting models rely on only single hybridization of data preprocessing and optimization methods while ignoring the significance of adaptive data preprocessing and effective optimization and selection strategies to obtain optimal models that improve the forecasting performance. To solve these problems, this study develops an improved electricity price forecasting model that offers the advantages of adaptive data preprocessing, advanced optimization method, kernel-based model, and optimal model selection strategy. Specifically, the adaptive parameter-based variational mode decomposition technique is proposed to provide desirable data preprocessing results, and a kernel-based optimization strategy based on the chaotic sine cosine algorithm is proposed and applied to develop optimal kernel-based extreme learning machine models. In addition, a novel proposed optimal model selection strategy is applied to determine the developed model that provides the most desirable forecasting result. Numerical results show that the developed model's performance metrics were best, and the average values of mean absolute error, root mean square error, mean absolute percentage error, index of agreement, and Theil's inequality coefficient in four datasets are 0.3127, 0.3765, 0.3725, 0.9097 and 0.0601, respectively, which imply that the developed model is a promising, applicable and efficient electricity price forecasting technique in the real electricity market.

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1. Introduction

Forecasting theory and methods play crucial roles in promoting economic social development, offering significant economic and social benefits and reduced related costs [1]. In the last few decades, research and applications of forecasting models have received much attention in many research fields. The electrical power system, which is one of the most complex of all economic systems, includes the generation, transmission, scheduling and consumption of electrical energy, which plays an important role in every field of social production [2]. The dynamic changes that occur inside power systems influence the power supply quality and can even threaten the power system's safety and stability. Therefore,

studies on electrical power systems are important both from theoretical and applied viewpoints and require further research due to their large size and growing influence. In recent years, numerous studies focused on electrical power systems have been conducted [3], such as power system planning [4], wind speed and power forecasting [5–10], load forecasting [11–15], and energy demand and price modeling [17–20]. Note that research and application into forecasting theory and methods are of critical practical significance in power market management. Furthermore, in the context of power market liberalization and deregulation, policy electricity prices have become a cornerstone by which market participants construct bidding strategies, procurement plans and make other decisions [16]. Market participants who can

* Corresponding author.
 E-mail address: sunshaolong@cs.kent.ac.uk (S. Sun).

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RESEARCH ARTICLE

A novel method based on probabilistic linguistic term sets and its application in ranking products through online ratings

Teng Fei^a | Liu Peide^a | Pedrycz Witold^b

^aDepartment of Management Science and Engineering, Shandong University of Finance and Economics, Jinan, China
^bDepartment of Electrical and Computer Engineering, University of Alberta, Edmonton, Alberta, Canada

Correspondence:
 Liu Peide, School of Management Science and Engineering, Shandong University of Finance and Economics, Jinan, 250014 Shandong, China.
 Email: Peide.liu@gmail.com

Abstract

In practical decision-making problems, the coexistence of several complex situations increases the difficulty for decision makers to make reasonable decision, such as attributes outnumber alternatives, heterogeneous relationships among multiple attributes, and individual risk tendency of decision maker. In view of the advantage of probabilistic linguistic term sets (PLTSs) in presenting qualitative information, a novel decision-making approach with PLTSs is constructed to deal with the above special situations simultaneously. To realize this goal, some basic methods have been proposed. First of all, to truly reflect the importance of attributes from the heterogeneous relationships, a weight determination model with generalized Banzhaf values is developed to analyze the interaction between combinations of attributes. Then, for analyzing the individual risk tendency of decision maker, the generalized Banzhaf TODIM method with PLTSs is constructed. Moreover, based on the above research results, the generalized Banzhaf TODIM-QUALIFLEX method with PLTSs is developed to solve decision-making problems where the number of attributes exceeds the number of alternatives, the combinations of attributes are interacted with each other, and decision maker is affected by individual risk propensity. Lastly, smartphones selection through online ratings is a

Consistency- and consensus-based group decision-making method with incomplete probabilistic linguistic preference relations

Peide Liu, Member, IEEE, Peng Wang and Witold Pedrycz, Fellow, IEEE

Abstract—The use of incomplete probabilistic linguistic term sets (InPLTSs) can enrich the flexibility of qualitative decision-making information expression, especially in decision-making situations with high time pressure and insufficient knowledge. In this study, we develop a method for group decision-making (GDM) with incomplete probabilistic linguistic preference relations (InPLPRs), considering consistency and consensus simultaneously. First, to fully explore the ability of InPLTSs to express uncertain information, InPLTSs are specifically classified. Then, an expected multiplicative consistency of InPLPRs is introduced, which is conducive to estimating the missing information more accurately and effectively. Subsequently, considering the consensus of GDM problems, a consensus index, which considers the principle of majority and minority, is developed to measure the agreement degree among multiple individuals. Because individual InPLPRs may not all meet acceptable consistency after reaching consensus, a consistency- and consensus-improving mathematical programming model considering information distortion is presented. Then, to aggregate all individual preference relationships into a collective one, a reliability index and ordered weighted geometric operator is introduced, whose induced variable reliability is determined by the confidence degree and consistency index of individual preference relationships. Furthermore, a multi-phase algorithm with InPLPRs is developed to solve GDM problems. Finally, a numerical example about fire emergency decision is presented to illustrate the applicability of the proposed method, and a detailed validity test and comparative analysis are conducted to highlight the advantages of the proposed method.

Index Terms—Group decision-making; incomplete probabilistic linguistic preference relation; expected multiplicative consistency; consensus; mathematical programming model; induced ordered weighted geometric operator.

NOMENCLATURE

AHP	Analytic hierarchy process
BLM	Basic unit-interval monotonic
CLPIS	Complete probabilistic linguistic term set
CLPFR	Complete probabilistic linguistic preference relation
DLPR	Distribution linguistic preference relation
EV-CLPFR	Expected value-based complete probabilistic linguistic preference relationship
EHLTS	Extended hesitant fuzzy linguistic term
GDM	Group decision-making
HFLT	Hesitant fuzzy linguistic term set
HFLT	Hesitant fuzzy linguistic term set
HFLPR	Hesitant fuzzy linguistic preference relation
IPLE	Incomplete probabilistic linguistic element
InPLTS	Incomplete probabilistic linguistic term set

P. Liu and P. Wang are with the School of Management Science and Engineering, Shandong University, Jinan, 250014, China (e-mail: Peide.Liu@sdu.edu.cn; wangpeng@sdu.edu.cn).
 W. Pedrycz is with the Department of Computer Engineering, University of Alberta, Canada (e-mail: wpedrycz@ualberta.ca).

InPLPR	Incomplete probabilistic linguistic preference relation
IOWG	Induced ordered weighted geometric
LDA	Linguistic distribution assessment
LT	Linguistic term
LTS	Linguistic term set
MLT-InPLTS	Missing LT in InPLTS
MP-InPLTS	Missing probability in InPLTS
OWG	Ordered weighted geometric
PD-HFLT	Possibility distribution for HFLT
PDM	Preference decision-making
PLPR	Probabilistic linguistic preference relation
PLTS	Probabilistic linguistic term set
PHLTS	Proportional HFLT
QGDQ	Quantifier-guided dominance degree
R-IOWG	Reliability-IOWG

I. INTRODUCTION

OWING to the increasing complexity of decision-making problems and the uncertainty of the decision-making environment, more experts are needed to participate in decision-making, thus GDM should be considered [1, 2]. Generally speaking, the evaluation of an object can be performed in many ways, e.g., through multi-attribute decision-making, which involves evaluating multiple attributes of an object and then obtaining a comprehensive evaluation result based on the values of each attribute [3, 4]. However, in some decision-making situations with high time pressure and insufficient knowledge, PDM is more effective. Through an AHP, Saaty [5] reported preference relation, which is a form of pairwise comparison between alternatives that allows experts to generate reasonable preference information about each object compared based on specific criteria. Preference relation is highly consistent with people's evaluation habits and has become the most common evaluation tool for presenting judgment information in decision-making.

The research of preference relationship in GDM mainly focuses on consistency and consensus. Consistency research involves consistency tests and improvement processes. In practical decision-making, it is very difficult to obtain a consistent decision matrix that represents a completely reasonable logical relationship. Therefore, a consistency test is the first and key step in the decision-making process. At present, the most commonly used consistency measures are additive consistency [1, 6–8] and multiplicative consistency [9–11]. In addition, because the inconsistent judgment matrix seriously restricts the accuracy of the decision results, the improvement mechanism of consistency has also attracted considerable attention [11–13]. There are two typical methods to improve the consistency, namely iterative and optimization adjustment. For instance, Zhou & Xu [13] introduced an iterative optimization algorithm to improve the consistency

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A weighting model based on best–worst method and its application for environmental performance evaluation

Peide Liu*, Baoying Zhu, Peng Wang

School of Management Science and Engineering, Shandong University of Finance and Economics, Jinan, Shandong 250014, China

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The analytic hierarchy process (AHP) is widely used as a multi-criteria decision-making method in practical applications. Several researchers have expanded the AHP method to D numbers AHP (D-AHP) to apply AHP to an uncertain decision-making environment. D numbers is an extension of the Dempster-Shafer (D-S) theory, which overcomes the shortcomings of the D-S theory and can effectively express uncertain information. With the deepening of research on the AHP method, the best-worst method (BWM) was proposed as an improvement to the AHP method. The BWM can lower the inconsistency in results and reduce the number of required pairwise comparisons. Although some researchers have extended the BWM method to an uncertain environment and proposed fuzzy BWM methods, these methods cannot handle some special situations, such as when the subjective evaluations of experts are conflicting or altogether missing. To apply the BWM method to these special situations, this study suggests combining the BWM with D numbers and proposes D numbers BWM (D-BWM) weighting model. First of all, we discuss D numbers extended fuzzy preference relation (DFPFR). Afterwards, we design an algorithm to select the best and worst criteria based on the DFPFRs by calculating the net-degrees and in-degrees. Furthermore, we develop a linear programming model to derive the weights of criteria, and then propose a consistency ratio to check the reliability of the derived results. The experimental results show that the D-BWM method is more suitable for realistic decision-making because of its simplicity and sensitivity to subjective information. Finally, the proposed method is applied to evaluate the environmental performance of 30 provincial administrative regions of China.

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1. Introduction

Multi-criteria decision-making (MCDM) is the process of evaluating situations and analyzing multiple conflicting assessments to arrive at a decision. It is a significant part of the decision-making theory [1]. Based on the discrete or continuous solution space, MCDM is usually divided into multi-attribute decision-making (MADM) and multi-objective decision-making. In this study, we used MCDM to represent MADM for convenience and practicality. Owing to the evaluation mechanism characteristics of MCDM, it is widely applicable to real decision-making environments such as in management [2], transportation [3], investment [4], and other fields [5,6]. Several MCDM methods have been researched and expanded, such as the analytic hierarchy process (AHP) [7,8] and the technique for order of preference by similarity to ideal solution (TOPSIS) method [9] for different decision situations. Among the MCDM methods, AHP is widely

used owing to its applicability and operability in practical applications [10]. AHP, proposed by Saaty [7,8], is based on pairwise comparisons and is widely used in practical management environments, such as public transport service development [11], urban planning [12,13] and urban sustainability assessment [14]. Furthermore, to overcome the environmental uncertainty in some practical decisions and the ambiguity of human consciousness, fuzzy sets [15], intuitionistic fuzzy sets [16], Pythagorean fuzzy sets [17], hesitant fuzzy sets [18], interval type-2 hesitant fuzzy sets [19] are proposed. Some researchers have expanded the classical AHP to the fuzzy AHP method with the aid of these fuzzy sets. Fuzzy AHP [20], intuitionistic fuzzy AHP [21], Pythagorean fuzzy AHP [22] and hesitant fuzzy AHP [23] are proposed to solve decision problems in different situations. These fuzzy AHP methods have a better comprehensive structure than the traditional AHP because these methods combine quantitative and qualitative criteria. For example, Zeynel et al. [20] applied the fuzzy AHP to study how to reduce water loss, and Liao and Xu [21] studied the consistency of AHP preference relationships in intuitionistic fuzzy environments. Ilbahi et al. [22] combined risk assessment with fuzzy AHP to evaluate occupational health.

* Corresponding author.
 E-mail address: peide.liu@sdu.edu.cn (P. Liu).
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The new extension of the MULTIMOORA method for sustainable supplier selection with intuitionistic linguistic rough numbers

Peide Liu^{a,*}, Hui Gao^{a,2}, and Hamido Fujita^b

¹ School of Management Science and Engineering, Shandong University of Finance and Economics, Jinan 250014, Shandong, China

² School of Business, Heze University, Heze, Shandong, China

Faculty of Software and Information Science, Iwate Prefectural University, Iwate, 020-0693, Japan
 *E-mail: peide.liu@gmail.com

Abstract Due to the increasing awareness of environmental and social issues, sustainable supplier selection (SSS) becomes an important problem. In order to scientifically evaluate the SSS, the aim of this paper is to develop a novel SSS method considering the robustness and relationship among experts. Firstly, a novel concept of intuitionistic linguistic rough numbers (ILRN) is proposed to accurately express the opinions of expert groups for SSS and to consider the interactive relationship among experts. Then we present a process to construct ILRN and introduce the arithmetic operations, distance measure, correlation measure, ranking rules, aggregation operators, and some corresponding properties. In addition, based on the correlation coefficients between attributes, we introduce a weight determining method. Moreover, considering the robustness of the ranking method, the multiplicative Multi-objective Optimization by Ratio Analysis (MOLTIMOORA) is enhanced by developing a new aggregated model and the improved Borda rule, which can consider both the subordinate utility values and ranks, and an intuitionistic linguistic MULTIMOORA method and an intuitionistic linguistic rough MULTIMOORA method are proposed. Finally, a real case of a third power bank SSS is conducted to illustrate the application of the proposed method, and a comparison is performed to explain the superiority and feasibility of the proposed method.

Keywords: Sustainable supplier selection; intuitionistic linguistic rough number; MULTIMOORA; Borda rule.

1. Introduction

Due to environmental pollution, resource depletion, and fierce competition, countries, organizations, and academic and professional institutes have reached a consensus on sustainable development [1]. However, the development of methods to balance the economic benefits and sustainable development has already become a challenging task for contemporary enterprises in the course of sustainable supply chain management (SSCM) [2,3]. Sustainable supplier selection (SSS) is considered the most significant issue in SSCM for advancing the close cooperative relationship between the purchaser and supplier [1,2,3,4,5].

Economic, environment and social attributes are involved in the evaluation and selection of an ideal sustainable supplier [6]. Consequently, SSS is regarded as a multi-attribute decision-making (MADM) process. The purpose is to select the optimal portfolio of sustainable suppliers among a set of alternatives. The recent literature reviews from Govindan et al. [4] and Rajeev et al. [5] show that MADM is one of the most common methods applied to SSS. Yu et al. [7] introduced a multi-attribute group decision-making (MAGDM) SSS method. Mohammed et al. [8] proposed a hybrid MCDM multi-objective optimization method for SSS and order allocation. Additionally, the vast majority of the

Multicriteria Decision Making With Incomplete Weights Based on 2-D Uncertain Linguistic Choquet Integral Operators

Peide Liu^{a,*}, Shiyi-Ming Chen^a, Fellow, IEEE, and Guolin Tang

Abstract—In regard to multicriteria decision making (MCDM) problems where the values of the criteria are expressed by 2-D uncertain linguistic variables (2DULVs), where the criteria are interactive and the criteria weights are incompletely known, two novel MCDM methods are proposed in this paper. First, we offer some novel operational rules of 2DULVs, which can avoid the operational results exceeding the boundary of linguistic term sets. Then, we propose four operators to capture the interactions over the criteria, namely, the 2-D uncertain linguistic Choquet averaging (2DULCA) operator, the 2-D uncertain linguistic Choquet geometric (2DULCG) operator, the Shapley 2DULCA (SDULCA) operator, and the Shapley 2DULCG (SDULCG) operator. In addition, we establish the models based on the maximization decision approach and the Shapley function to get the criteria weights. Finally, we propose two novel MCDM methods under 2-D uncertain linguistic environments, where four examples are used to explain the created MCDM methods. Comparative experimental results are presented to highlight the superiorities of the created approaches.

Index Terms—2-D uncertain linguistic variable (2DULV); Choquet integral; fuzzy measure (FM); generalized Shapley index (GSI); multicriteria decision making.

I. INTRODUCTION

SINCE Zadeh [1] presented the notion of linguistic variables (LVs), the study on multicriteria decision making (MCDM) with linguistic information or its extensions has gained widespread attention [2]–[7]. Zhang and Xiang [2] extended the vectorial/interval optimization I compromise

research (VIKOR) approach to a probabilistic linguistic environment for MCDM. Wan et al. [3] extended the elimination et choice translating reality II (ELECTRE II) method to handle interval 2-ratio linguistic (2TL) MCDM problems. Beg and Rashed [4] presented a fuzzy technique for order preference by similarity to ideal solution (TOPSIS) method for dealing with hesitant 2TL MCDM problems. It is obvious that the VIKOR method, the ELECTRE II approach, and the TOPSIS method can deal with fuzzy linguistic MCDM problems. Although they can provide the ranking of alternatives, they cannot provide comprehensive criteria values of alternatives. The MCDM methods based on fuzzy linguistic aggregation operators not only provide the ranking of alternatives but also provide comprehensive criteria values of alternatives, which have widely been investigated recently. For instance, Liu et al. [5] explored a series of interval grey uncertain linguistic aggregation operators. Na [6] proposed some triangular fuzzy linguistic aggregation operators, and Ju et al. [7] investigated many trapezoidal fuzzy 2TL aggregation operators, which have been utilized to handle MCDM problems.

The MCDM methods in [2]–[7] with fuzzy linguistic information are developed so perfectly that it seems all fuzzy linguistic MCDM problems can be well solved. But even so, there are three issues that need to be pointed out:
 1) The traditional fuzzy linguistic operators are not closed, which could cause granularity problems [8] and logical problems [9]. For example, let $S = \{a, b\} = \{0, 1, \dots, 5\}$ be a linguistic term set (LTS), and let $\{x_1, x_2\}$ and $\{x_3, x_4\}$ be two uncertain LVs (ULVs); then according to operations of ULVs [9], we can obtain $\{x_1, x_2\} \otimes \{x_3, x_4\} = \{a_6, a_6\}$. It is obvious that this result exceeds the boundary of S .

2) For some fuzzy linguistic MCDM problems, for instance, the blind review of journal articles and the assessment on the project, the decision makers (DMs) not only need to provide the assessment results of the criteria by utilizing the linguistic information, such as “bad”, “good”, and “very good”, but also need to provide their reliability judgments of these evaluation results by utilizing the linguistic information, such as “very infirm”, “infirm”, and “extremely infirm”. The traditional fuzzy linguistic methods in [2]–[7] cannot solve this issue, that is, they cannot describe the linguistic information about the dependability of a DM’s subjective evaluation.

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 P. Liu is with the School of Management Science and Engineering, Shandong University of Finance and Economics, Jinan 250014, China (e-mail: peide.liu@sdu.edu.cn; chen_shiyiming@163.com).
 S. M. Chen is with the Department of Computer Science and Information Engineering, National Tainan University of Science and Technology, Tainan 700, Taiwan (e-mail: chenst@mail.ntust.edu.tw).
 G. Tang is with the School of Economics and Management, Beijing University of Technology, Beijing 100124, China (e-mail: tangguolin@bjut.edu.cn).
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