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# A novel interactive approach for solving uncertain bi-level multi-objective supply chain model



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#### ABSTRACT

In this paper, we adopt an interactive approach for bi-level multi-objective supply chain model (BL-MOSCM). The essential target is to decide the ideal request designation of items where the client's demands and supply for the items are vague demand. This study considers two decision-makers (DMs) operating at two separate groups of supply chain network (SCN), that is, a bi-level decision-making process. In the current BL-MOSCM, the leader locates quantities dispatched to retailers, and afterward, the follower chooses his amounts reasonably. The pioneer's goal is to reduce the all-out conveyance expenses, also, the follower's goal is to reduce the all-out conveyance time of the SCN and simultaneously adjusting the optimal request allotment from each source, plant, retailer, and distribution center, respectively. The BL-MOSCM is defuzzified and changed into a valent crisp structure based on the *α*-level methodology. Then the interactive methodology works on the *α*-(BL-MOSCM) by changing it into discrete multi-objective programming problems (MOPP). Also, each separate MOPP thinks through the ∊-constraint methodology and the idea of satisfactoriness. The ∊-constraint method aims at optimising one objective function, while considering all other objective functions as constraints. By obtaining the solution of the first level SCN utilizing the  $∈$ -constraint method, the second level SCN is also optimized considering the controlled variables of the first level. A novel test function is introduced to decide the compromise solution of the BL-MOSCM. Procedures for solving the uncertain BL-MOSCM via the interactive approach are introduced. A real-life case study was used to illustrate the proposed interactive methodology for the BL-MOSCM with fuzzy parameters. The obtained result shows the optimal quantities transported from the various sources to the various destinations that could enable managers to detect the optimum quantity of the product when hierarchical decision-making involving two levels. Finally, a comparison with the past studies is used to display the practicality and efficiency of the suggested methodology.

### **1. Introduction**

Supply chain management (SCM) has been progressively highlighted over the latest decennium. The concentration has been set to maximize the profit-making execution, purse profiteering, and sustainability through joining holistic decision-making on both onward and inverse logistics [\(Amin and Zhang, 2013; Jolai et al., 2011](#page-15-0)).

A supply chain network (SCN) is a regulation of organizations, individuals, technologies, activities, data, and assets engaged with moving an item or administration from provider to client. Organizations are doing designing, buying, industrialization, marketing, and allotment via SCN, work freely with their targets which predominating guided to clashes and consequently there is a requirement for a system out of which these various tasks can be incorporated. SCN is a system to accomplish such combination among the autonomous organizations [\(Yu](#page-17-0)  [and Solvang, 2020; Amin and Zhang, 2013](#page-17-0)).

These days, SCNs are pull faced with environmental changes, social enactments, and disturbance chances; so, they should figure out how to be totally ready in confrontation of uncertain proceedings and novel variation in the planet [\(Charles et al., 2019; Gupta et al., 2021; Cancinoa](#page-16-0)  [et al., 2019](#page-16-0)). Uncertainty is inevitable and tending to the equivalent is inescapable. That everything is accessible at our doorstep is because of an all-around oversaw current worldwide supply chain (SC), which happens regardless of its productivity and viability being undermined by

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Available online 8 May 2022 0360-8352/© 2022 Elsevier Ltd. All rights reserved. Received 4 September 2021; Received in revised form 22 March 2022; Accepted 3 May 2022 different wellsprings of uncertainty beginning from the desire side, supply side, producing cycle, designing and control frameworks.

Today we live in a highly interconnected world economy that organizes millions of businesses operating across different regions or countries. Given smooth economic coordination is a pre-condition for the successful functioning of the global economy, SCM offers the most needed service to ensure a strong network between a company and its suppliers to manufacture or produce, then to distribute goods to customers [\(www.statista.com, xxxx](#page-17-0)). As a commercial system of organizations, resources, information, and people, the SCN forms a complex and dynamic supply and demand network between a multitude of economic agents. The expansion of international trade triggered the importance of SCM further [\(www.statista.com, xxxx\)](#page-17-0). For instance, the global SCM market was worth roughly 16 billion U.S. dollars in 2020. Over the last decade, SCM software and procurement market expanded more than twice [\(www.statista.com, xxxx](#page-17-0)). These networks of supply chains form the so-called global value chains, which is the prevailing method of interaction in international trade relations. Fig. 1 indicates the biggest supply chain challenges worldwide on 2017–2018 [\(www.statista.com,](#page-17-0)  [xxxx\)](#page-17-0).

To explore SC uncertainty, we must initially characterize the connected key ideas. SCN, [Fig. 2.](#page-2-0), comprises of a dispersion organization of the item equipping from origin to objective, i.e., the commute of the crude item from providers to producers, from makers to wholesalers, then, at that point from merchants to retailers, lastly, from retailers to clients. The industrialist gets the crude item from the providers and after handling it into completed products, he stocks the last to various distribution centers and retailers to ready them effectively accessible for the clients [\(Charles et al., 2019; Cancinoa et al., 2019](#page-16-0)).

All through the 20<sup>th</sup> century, the SCN issue has been acquiring significance because of market globalization, which has expanded the opposition among the organizations. During the formularization operation of genuine world issues, the possible rate of these coefficients is dubious or equivocally known to the decision-makers (DMs) ([Aliev et al., 2007;](#page-15-0)  Charles et al., 2019; Jiménez et al., 2007; Liu and Kao, 2004; Liang, [2006\)](#page-15-0). Consistently, it would be more helpful for these coefficients to be addressed as fuzzy mathematical information [\(Çalık et al.\)](#page-16-0). The resulting SCN which joins obscure coefficients would be seen as more genuine than the standard one. According to this point of view, the coefficients exist in the proposed BL-MOSCM are believed to be characterized by fuzzy numbers ([Elsisy and El Sayed, 2019; El Sayed and Abo-Sinna,](#page-16-0) 

[2021\)](#page-16-0).

The bi-level programming problem (BLPP) is the most utilized demonstrating strategy in decentralized associations. The BLPP has two players; every one of the players knows their scenario and decides their own technique as per the other player's procedure ([Amirtaheri et al.,](#page-15-0)  [2018; Çalık et al.; Sakawa and Nishizaki, 2009\)](#page-15-0). However, in this model, players don't help one another.

In genuine world models, top administration or a leader board should think other players' procedure in by and large administration strategy. Interactive fuzzy programming (IFP) has been proposed by Sakawa et al. ([Sakawa et al., 1998; Sakawa et al., 2000\)](#page-16-0) to cope with this problem. Also, BLPP were solved in view of IFP to overcome such problem [\(Sakawa et al., 1998\)](#page-16-0).

To contend with different types of uncertainty, different uncertainty programming approaches have been introduced, among them, fuzzy programming (FP), stochastic programming (SP), and robust optimization (RO) are the most applied ones. When randomness is the main source of uncertainty in the input coefficients of a decision model and there are enough historical data to estimate their probability distributions reliably, SP approach is a suitable candidate to cope with such uncertain data.

However, in most real cases, as there is not enough historical data, obtaining the exact random distribution of uncertain input data is difficult. Also, some cases may deal with elasticity (softness) in constraints or/and flexibility on the goals' target values. FP method can deal with both the epistemic uncertainty in input data and soft constraints using the two well-known categories of FP approach. The main assumption in this study is that the coefficients of the objective functions and the constraints in the BL-MOSCM are fuzzy parameters. To bridge the gap between the industrial practices and the lack of corresponding research, we propose an approach that directly captures their multi-level and uncertainty aspects based on BLPP principles.

In this paper we developed an interactive approach for BL-MOSCM with fuzzy parameters. The main aim is to decide ideal required assignment of items where the client's requests and supply for the items have a vague nature. In the created model the gross transportation costs are minimized at the first level, and the second level aim is to minimize the entire conveyance era of the SC and simultaneously adjusting the ideal request allotment from each source, plant, retailer, and distribution center, respectively. Considering the *α*-level methodology, the desired *α*-(BL-MOSCM) is developed. Then, at that point, the interactive



**Fig. 1.** The biggest supply chain challenges worldwide on 2017–2018.

<span id="page-2-0"></span>

**Fig. 2.** Supply Chain Network.

methodology improves the *α*-(BL-MOSCM) by changing it over into discrete MOPPs. Additionally, each separate MOPP is settled by the ∊-constraint methodology and the idea of satisfactoriness. At last, mathematical epitome and rapprochements with the past research are used to show the achievability and efficiency of the suggested methodology.

### **2. Literature review**

Over the years, comprehensive exploration articles have been directed for the evolution of several optimization models for SCN ([Bredstrom and Ronnqvist, 2002; Fahimnia et al., 2013; Gumus et al.,](#page-15-0)  [2009; Selim et al., 2008\)](#page-15-0). Among these studies Feili and Khoshdooni ([Feili and Khoshdoon, 2011](#page-16-0)), introduced A fuzzy optimization type for SC production designing with overall portion of decision making. Liang used fuzzy goal programming (FGP) to manufacturing/transportation arranging choices in a SC ([Liang, 2007\)](#page-16-0). FP for revenue and cost allotment to a fabrication and transportation issue has been studied by Sakawa et al. [\(Sakawa et al., 2001\)](#page-16-0). Aliev et al. [\(Aliev et al., 2007\)](#page-15-0) exhibited fuzzy-genetic way to deal with production–distribution designing in SCM. Mathematical programming and solution approaches for minimizing tardiness and transportation costs in the supply chain scheduling problem has been studied by Tamannaei and [Rasti-Barzoki](https://www.sciencedirect.com/science/article/abs/pii/S0360835218305448)  ([Tamannaei and Rasti-Barzoki, 2019\)](#page-17-0).

A mathematical programming approach to SCM under fuzziness has been studied by Chen and Chang ([Chen and Chang, 2006\)](#page-16-0). SC planning under uncertainty established on a FP approach was presented by Peidro et al. [\(Peidro et al., 2007](#page-16-0)). Application of FP technique to deal with the production allotment and distribution SCN issue has been proposed by Bilgen ([Bilgen, 2010\)](#page-15-0). A linear FP pattern for the optimization of multiphase SCNs via different membership functions was also, introduced by Paksoy and Pehlivan [\(Paksoy and Pehlivan, 2012\)](#page-16-0). Multi-agent supply chain scheduling problem by considering resource allocation and transportation was studied by Aminzadegan et al. [\(Aminzadegan et al.,](#page-15-0)  [2019\)](#page-15-0). Budiman and Rau presented a mixed-integer model for the implementation of postponement strategies in the globalized green supply chain network [\(Budiman and Rau, 2019\)](#page-16-0). Pishvaee et al. [\(Pish](#page-16-0)[vaee et al., 2011](#page-16-0)) sophisticated a mixed-integer linear type for closed loop SCN purpose. Effects of power structure on manufacturer encroachment in a closed-loop supply chain was considered by Zheng et al. ([Zheng et al., 2019](#page-17-0)). To deal with uncertainty, a strong optimization paradigm is suggested by researchers in [\(Pishvaee and Torabi,](#page-16-0)  [2010\)](#page-16-0). Pishvaee and Razmi [\(Pishvaee and Razmi, 2012](#page-16-0)) exhibited a multi-objective FP paradigm for ecological SCN planning. Mula et al. ([Mula et al., 2010](#page-16-0)) introduced a survey of various methods for SCM and arranged them dependent on linear, non-linear, multi-objective, fuzzy, stochastic programming, and metaheuristics.

Numerous academics and professionals have been ceaselessly zeroing in on addressing dubious SCNs. Sabri and Beamon, [\(Sabri and Bea](#page-16-0)[mon, 2000](#page-16-0)) fostered an integrated technique for tackling multi-objective SCN (MO-SCN) that incorporates synchronous vital and functional arranging together, i.e., manufacturing cost, submission time with dubious demand. Selim and Ozkarahan ([Selim and Ozkarahan, 2008\)](#page-16-0) fostered a MO-SCM to acquire the ideal numbers, areas, and ability levels of plants and distribution centers to convey the items to the retailers basically cost while fulfilling the ideal service level. Yeh and Chuang [\(Yeh et al., 2011\)](#page-17-0) suggested MO-SCM for accomplice choice in green SC issues. Charles et al. ([Charles et al., 2019](#page-16-0)) incorporated the different phases of SCN and figured it as a MOPP. Likewise, Gupta et al. [\(Gupta et al., 2021\)](#page-16-0) showed the Significance of MOPP in coordination for multi-product SCN under intuitionistic fuzzy area. An intuitionistic fuzzy T-sets established optimization procedure for manufacturing-allocation arranging in SCM has been developed by Garai et al. ([Garai et al., 2016\)](#page-16-0).

A possibilistic linear programming model for supply chain network design (SCND) under uncertainty has been introduced by Bouzembrak ([Bouzembeak, 2013](#page-15-0)). A comprehensive review and future research directions in SCND under uncertainty was exhibited by Govindan et al. ([Govindan et al., 2017](#page-16-0)). Baidya suggested stochastic SC transportation models implementations and benefits [\(Baidya, 2019\)](#page-16-0). Boronoos et al. proposed a robust mixed flexible‑possibilistic programming approach for multi‑objective closed‑loop green SCND ([Boronoos et al., 2021](#page-16-0)). Recently, [Salehi-Amiri](https://journals.scholarsportal.info/search?q=Amirhossein%2520Salehi-Amiri%26search_in=AUTHOR%26sub=) et al., [designed a closed-loop SCN considering](https://journals.scholarsportal.info/details/0307904x/v101icomplete/600_dacscnacsoai.xml%26sub=all)  [social factors with a case study on Avocado industry](https://journals.scholarsportal.info/details/0307904x/v101icomplete/600_dacscnacsoai.xml%26sub=all) [\(Salehi-Amiri et al.,](#page-16-0)  [2022\)](#page-16-0). Developing a bi-objective mathematical model to design the fish closed-loop supply chain introduced by [Fasihi](https://www.ije.ir/?_action=article%26au=837068%26_au=M.%2b%2bFasihi) et al. [\(Fasihi et al., 2021](#page-16-0)). Sustainability in designing agricultural supply chain network: A case study on palm date proposed by [Hamdi-Asl](http://scientiairanica.sharif.edu/?_action=article%26au=140246%26_au=Abdolreza%2b%2bHamdi-Asl) et al. ([Hamdi-Asl et al.,](#page-16-0)  [\(2021\)\)](#page-16-0).

Robust SCND with service level against disruptions and demand uncertainties with a real-life case has been introduced by Baghalian et al. [\(Baghalian et al., 2013\)](#page-16-0). Farahani et al. [\(Farahani et al., 2014\)](#page-16-0) gave an audit of serious climate on SCN plan. They classified the connected writing in SCN plan that thought about rivalry in demonstrating such issue. Cheraghalipour et al. exhibited Pareto-based algorithms for a biobjective optimization of citrus closed-loop SCN [Cheraghalipour et al.](#page-16-0)  [\(2018\).](#page-16-0) Samadi et al. suggested heuristic-based metaheuristics to address a sustainable SCND problem [\(Samadi et al., 2018](#page-17-0)). Integrated design of sustainable supply chain and transportation network using a fuzzy bi-level decision support system for perishable products studied by Tirkolaee and Aydin ([Tirkolaee and Aydin, 2022](#page-17-0)). Optimization of multi-period three-echelon citrus SC problem was introduced by Sahebjamnia et al. [\(Sahebjamnia et al., 2020\)](#page-17-0). A distribution planning model for natural gas SC was studied by Hamedi et al. [\(Hamedi et al.,](#page-16-0)  [2009\)](#page-16-0). Benders' decomposition for concurrent redesign of forward and closed loop SCN with demand and return uncertainties has been suggested by Khatami et al. ([Khatami et al., 2015\)](#page-16-0).

### *2.1. Research gap*

Even though SCN issue has been concentrated broadly, truth be told, seldom consideration has been designated to use BLPP as the modeling approach. SCN issue can be addressed as a Leader-Follower where superior choice directors are the pioneers, and the constructing agents are the adherents who settle on choices about their exercises by thinking about high scale choices ([El Sayed et al., 2020; Sakawa and Nishizaki,](#page-16-0)  [2009\)](#page-16-0).

The integrated problem of buying, production, and delivery planning in an SC is demanding as businesses push into higher collaboration and competitive situations. Prominent work related to the BLPP in the SCN is discussed in studies by Hajiaghaei-Keshteli and Fathollahi-Fard [\(Hajia](#page-16-0)[ghaei-Keshteli and Fathollahi-Fard, 2018\)](#page-16-0). They solved the distribution network problem using the two-stage stochastic BLPP under efficient heuristics and *meta*-heuristics approaches. Sun et al. [\(Sun et al., 2008\)](#page-16-0) exhibit a BLPP to acquire the optimal area for logistics allocation focuses. The leader provides the optimal area, and the follower decides a balance request dispersion.

Roghanian et al. ([Roghanian et al., 2007](#page-16-0)) treat a stochastic multiobjective BLPP and its implementation in big business vast SCN where a few parameters are random variables. A decentralized multi-objective maintainable SCM under an intuitionistic fuzzy climate was introduced by Kamal et al. ([Kamal et al., 2020\)](#page-16-0). Ryu et al. [\(Ryu et al., 2004\)](#page-16-0) recommended a BLPP involving two models with questionable demand, one for creative designing and one for circulation designing. Kolak et al. ([Kolak et al., 2018](#page-16-0)) outlined a BLPP for the traffic network optimization under maintainability. Karimi et al. [\(Karimi et al., 2018\)](#page-16-0) introduced a BLPP for evaluating demand reaction continuously retail markets. Amirtaheri et al. [\(Amirtaheri et al., 2018\)](#page-15-0) utilized a BLPP for a decentralized industrialist and wholesaler of SC by thinking about helpful advertising.

Gupta et al. [\(Gupta et al., 2018](#page-16-0)) developed a SCN as a BLPP wherein the optimal demand allotment of items is the DM's essential objective, accepting that the items' demands, and supply are vague. Hsueh [\(Hsueh,](#page-16-0)  [2015\)](#page-16-0) accessed BLPP in sustainable SCM for collaboration with corporate social responsibility. Rowshannahad et al. [\(Rowshannahad et al.,](#page-16-0)  [2018\)](#page-16-0) formulated a multi-item commodity problem of SCN as a BLPP having multiple by products that can be remanufactured and reused. Chalmardi and Camacho-Vallejo [\(Chalmardi and Camacho-Vallejo,](#page-16-0)  [2019\)](#page-16-0) fostered a BLPP for a reasonable SCN plan that thinks about the public authority's monetary impetuses.

None of the past examinations present the hole between the industrial practices and the lack of corresponding research, so we propose an approach that directly captures their multi-level and uncertainty aspects based on BLPP principles. In the presented BL-MOSCM all the parameters have a fuzzy nature. Moreover, an interactive approach is presented to solve such uncertain BL-MOSCM which has not presented in literature before.

The rest of this work is coordinated as: Notions and definitions were presented in Sect. 3. Sect. 4 portrays problem definition and model formularization. A novel interactive approach for the *α*-(BL-MOSCM) was setup in Sect. 5. The next section presents detailed procedures to cope with the fuzzy BL-MOSCM. Numerical results were given in Sect. 7. At last, we conclude the research and give some future bearings.

#### **3. Notions and definitions**

This segment is committed to a prologue to trapezoidal fuzzy number and ∈-constraints notations (Baky et al., 2014; Charles et al., 2019; [Emam, 2013; Osman et al., 2018](#page-15-0)):

**Definition 1.** *Let E be a universal set, A mapping*  $\mu$  :  $E \rightarrow [0, 1]$  *is a* 

*membership function, if*  $\mu(x) \in [0,1]$ . *A fuzzy set A is the pair*  $(E, \mu)$ .

**Definition 2.** *Let*  $E \in \mathbb{R}^n$ *. Then the fuzzy set*  $\widetilde{A} = (E, \mu)$  *is convex, if*  $\forall x$ *,*  $\mathbf{y} \in E$  and  $\lambda \in [0, 1]$  *such that*  $\mu(\lambda \mathbf{x} + (1 - \lambda)\mathbf{y}) > \min{\{\mu(\mathbf{x}), \mu(\mathbf{y})\}}$ .

**Definition 3.** *A fuzzy set*  $\widetilde{A} = (E, \mu)$  *for*  $E \in R$  *is called a fuzzy number if*  $\widetilde{A}$ *is convex and normal*, *μ is piecewise continuous*, *Aα is a closed interval for all*   $\alpha \in (0, 1]$ *, and support is bounded ([Gen et al., 1992](#page-16-0)).* 

**Definition 4.** *for*  $\widetilde{A} = (E, \mu)$  *and*  $\alpha \in [0, 1]$ : *The*  $\alpha$ -*cut or*  $\alpha$ -*level set is*  $A \ge \alpha$ ,  $A_{\alpha} = \{x \in E | \mu(x) \ge \alpha\}$  and the strong *α*-*cut*  $A > \alpha$ ,  $A_{\alpha}^{'} =$  $\{x \in E | \mu(x) > \alpha\}.$ 

**Definition 5.** *A trapezoidal fuzzy number (TFN)*  $\widetilde{A} = (R, \mu)$  *is a fuzzy number whose*  $\mu(x)$  *is defined as [\(Charles et al., 2019; Jim](#page-16-0)énez et al.,* [2007\)](#page-16-0):

$$
\mu(x) = \begin{cases}\n\frac{(x-a)}{(b-a)} & \text{if } a \le x \le b \\
1, & \text{if } b \le x \le c \\
\frac{(d-x)}{(d-c)} & \text{if } c \le x \le d \\
0, & \text{otherwise}\n\end{cases}
$$
\n(1)

Where  $a, b, c, d \in R$  with  $a \leq b \leq c \leq d$ . Note that  $\mu(x)$  is a piecewise continuous and  $\widetilde{A}$  is normal. Further, the quadruple  $(a, b, c, d)$  is suffient to describe  $\widetilde{A}$ . The *α*-cut of the TFN  $\widetilde{A} = (a, b, c, d)$  is the closed interval.

$$
\widetilde{A}_a = \left[ \widetilde{A}_a^L, \widetilde{A}_a^U \right] = \left[ a + (b - a)\alpha, d - (d - c)\alpha \right]
$$
\n(2)

The TFN  $\widetilde{A} = (m, n, \gamma, \delta)$ , with defuzzifiers  $m, n$ , left and right fuzziness *γ >* 0; *δ >* 0, is given as [\(Gen et al., 1992; Gumus et al., 2009\)](#page-16-0):

$$
\mu(x) = \begin{cases}\n\frac{1}{\gamma}(x - m + \gamma) i f m - \gamma \leq x \leq m \\
1, i f m \leq x \leq n \\
\frac{1}{\delta}(n - x + \delta) i f n \leq x \leq n + \delta \\
0, otherwise\n\end{cases}
$$
\n(3)

The *α*-cut of the TFN  $\widetilde{A} = (m, n, \gamma, \delta)$  is the closed interval.

$$
\widetilde{A}_\alpha = \left[ \widetilde{A}_\alpha^L, \widetilde{A}_\alpha^U \right] = \left[ (m - \gamma) + \alpha \gamma, (n + \delta) - \alpha \delta \right] \tag{4}
$$

∊-constraint method

This methodology converts the MOPP into a single objective decision-making (SO-DM) issue with extra constraints. The function with a high need is considered as an objective. Different objectives are composed as constraints by utilizing a constrain vector ∊*i*. The changed issue is composed as [\(Osman et al., 2018](#page-16-0)):

$$
minf_l(x) \tag{5}
$$

*subjectto* 

$$
f_i(x) \le \epsilon_i \forall i = 1, 2, \cdots, k, i \ne l
$$
\n
$$
(6)
$$

$$
x \in X, \quad x \ge 0 \tag{7}
$$

where  $l \in \{1, 2, \dots, k\}$ . The selection of  $f_l(x)$  and  $\epsilon_i$  of this strategy rely upon the issue viable.

#### **4. Mathematical model**

In most practical situations, the parameters might take loose qualities because of some potential reasons as recorded underneath ([El Sayed](#page-16-0)  [and Abo-Sinna, 2021; Gupta et al., 2018; Gupta et al., 2021; Tirkolaee](#page-16-0)  [and Aydin, 2022\)](#page-16-0):

**Table 1**  Documentations and Nomenclature.



1- The price of the thing may rely on the interest of the DM. Here and there, he may choose to spend for the amount requested.

2- The Cost of transportation of one item from the origin to the factory, from the factory to the retailer, from the factory to the distribution center, and from the stockroom to the retailer isn't investigated exactly to the DM.

3- Equivalently, the submission time of delivery one item from the factory to the retailer, from the factory to the stockroom and, from the distribution center to the retailer might change pending the conveyance time frame.

[2021; NabiL et al., 2021; Torabi and Hassini, 2008; Tirkolaee and Aydin,](#page-16-0)  [2022\)](#page-16-0):

Mathematically the BL-MOSCM with fuzzy demands, in [Fig. 3](#page-5-0)., can be modeled as ([El Sayed et al., 2020; Gupta et al., 2018; Gupta et al.,](#page-16-0)  [2021; Jolai et al., 2011; NabiL et al., 2021; Tirkolaee and Aydin, 2022](#page-16-0)):

(8)

[1*st***level**]

$$
\min_{W_{lk}}\left(f_{11} = \sum_{l=1}^{L} \sum_{k=1}^{K} \widetilde{C}_{lk} W_{lk} + \sum_{k=1}^{K} \sum_{i=1}^{l} \widetilde{C}_{ki} Y_{ki} f_{12} = \sum_{l=1}^{L} \sum_{k=1}^{K} \widetilde{C}_{lk} W_{lk} + \sum_{k=1}^{K} \sum_{j=1}^{l} \widetilde{C}_{kj} X_{kj} f_{13} = \sum_{l=1}^{L} \sum_{k=1}^{K} \widetilde{C}_{lk} W_{lk} + \sum_{k=1}^{K} \sum_{j=1}^{l} \widetilde{C}_{kj} X_{kj} + \sum_{j=1}^{l} \sum_{i=1}^{l} \widetilde{C}_{ji} Z_{ji}\right)
$$

Considering the previous mentioned potential circumstances in SCM, so the main assumption in the proposed BL-MOSCM is that the coefficients of the objective functions and the constraints are fuzzy parameters. we have deemed the accompanying documentations which are recorded underneath in Table 1, ([Gupta et al., 2018; Gupta et al.,](#page-16-0) 

<span id="page-5-0"></span>[2*nd***level**]

$$
\sum_{j=1}^{J} Z_{ji} + \sum_{k=1}^{K} Y_{ki} \ge \widetilde{D}_i,
$$
\n(13)

$$
\min_{X_{kj}, Y_{ki}, Z_{ji}} \left( f_{21} = \sum_{k=1}^K \sum_{l=1}^l \widetilde{D}_{ki} Y_{ki} + \sum_{k=1}^K \sum_{j=1}^J \widetilde{D}_{kj} X_{kj}, \quad f_{22} = \sum_{k=1}^K \sum_{i=1}^I \widetilde{D}_{ki} Y_{ki} + \sum_{k=1}^K \sum_{j=1}^J \widetilde{D}_{kj} X_{kj} + \sum_{j=1}^J \sum_{i=1}^I \widetilde{D}_{ji} Z_{ji} \right)
$$
(9)





$$
subject to
$$

$$
\sum_{k=1}^K W_{lk} \le \widetilde{B}_l,
$$
\n(10)

$$
\sum_{i=1}^{I} Y_{ki} + \sum_{j=1}^{J} X_{kj} \leq A_k, \tag{11}
$$

$$
\sum_{i=1}^l Z_{ji} \le E_j, \qquad (12)
$$

$$
\sum_{l=1}^{L} W_{lk} \geq \sum_{j=1}^{J} X_{kj} + \sum_{i=1}^{I} Y_{ki}, \qquad (14)
$$

$$
\sum_{k=1}^K X_{kj} \ge \sum_{i=1}^I Z_{ji},\tag{15}
$$

$$
W_{lk} \geq 0, X_{kj} \geq 0, Y_{ki} \geq 0, Z_{ji} \geq 0; \forall i, j, l, k
$$
\n(16)

where whole the vague demands in model (8)-(16) are assumed to be TFNs of the formation  $(m, n, \alpha, \beta)$  (Baky et al., 2014; Elsisy and El Sayed, [2019; El Sayed et al., 2020; El Sayed and Abo-Sinna, 2021\)](#page-15-0). By applying the *α*-cut methodology the model (8)-(16) is changed over into the accompanying deterministic form at different values of  $\alpha$  (Baky et al., [2014; Elsisy and El Sayed, 2019; El Sayed et al., 2020; El Sayed and Abo-](#page-15-0)[Sinna, 2021\)](#page-15-0):

### [1*st***level**]

$$
(f_{11})_{\alpha} = \sum_{l=1}^{L} \sum_{k=1}^{K} [C_{lk}^{1} - \gamma_{C_{lk}}(1-\alpha)] W_{lk} + \sum_{k=1}^{K} \sum_{i=1}^{I} [C_{ki}^{1} - \gamma_{C_{ki}}(1-\alpha)] Y_{ki},
$$
\n
$$
\underbrace{\min}_{W_{lk}} \left( f_{12} \right)_{\alpha} = \sum_{l=1}^{L} \sum_{k=1}^{K} [C_{lk}^{1} - \gamma_{C_{lk}}(1-\alpha)] W_{lk} + \sum_{k=1}^{K} \sum_{j=1}^{J} [C_{kj}^{1} - \gamma_{C_{kj}}(1-\alpha)] X_{kj},
$$
\n
$$
(f_{13})_{\alpha} = \begin{bmatrix} \sum_{l=1}^{L} \sum_{k=1}^{K} [C_{lk}^{1} - \gamma_{C_{lk}}(1-\alpha)] W_{lk} + \sum_{k=1}^{K} \sum_{j=1}^{J} [C_{kj}^{1} - \gamma_{C_{kj}}(1-\alpha)] X_{kj} \\ + \sum_{j=1}^{J} \sum_{i=1}^{I} [C_{ji}^{1} - \gamma_{C_{ji}}(1-\alpha)] Z_{ji} \end{bmatrix} \right)
$$

(17)

$$
\sum_{k=1}^{K} X_{kj} \geq \sum_{i=1}^{I} Z_{ji},
$$
\n(24)

 $[2^{nd}$ **level**]

*subjectto* 

 $\sum_{k=1}^K W_{lk} \leq \left[ B_l^2 + (1-\alpha)\beta_{B_l} \right]$ 

 $\sum_{j=1}^{J} Z_{ji} + \sum_{k=1}^{K} Y_{ki} \geq \left[ D_i^1 - \gamma_{D_i} (1-\alpha) \right]$ 

 $\sum_{l=1}^{L} W_{lk} \geq \sum_{j=1}^{J} X_{kj} + \sum_{i=1}^{I}$ 

 $\sum_{i=1}^{I} Y_{ki} + \sum_{j=1}^{J} X_{kj} \leq A_k,$ (20)

 $\sum_{i=1}^{n} Z_{ji} \le E_j,$  (21)

*Yki,* (23)

∑*<sup>K</sup>*

∑*<sup>I</sup>*

∑*<sup>I</sup>*

∑*<sup>J</sup>*

∑*<sup>L</sup>*

 $W_{lk} \geq 0, X_{kj} \geq 0, Y_{ki} \geq 0, Z_{ji} \geq 0; \forall i, j, l, k$ (25)

$$
\min_{X_{kj}, Y_{ki}, Z_{ji}} \left( \frac{\left(f_{21}\right)_{\alpha} = \sum_{k=1}^{K} \sum_{l=1}^{I} \left[D_{ki}^{1} - \gamma_{D_{ki}}(1-\alpha)\right] Y_{ki} + \sum_{k=1}^{K} \sum_{j=1}^{J} \left[D_{kj}^{1} - \gamma_{D_{kj}}(1-\alpha)\right] X_{kj}}{\sum_{k=1}^{K} \sum_{i=1}^{I} \left[D_{ki}^{1} - \gamma_{D_{ki}}(1-\alpha)\right] Y_{ki} + \sum_{k=1}^{K} \sum_{j=1}^{J} \left[D_{kj}^{1} - \gamma_{D_{kj}}(1-\alpha)\right] X_{kj}} \right)
$$
\n
$$
(18)
$$

*,* (19)

*,* (22)

Consider *G* to indicate the set of constraints of the above *α*-(BL-MOSCM).

### **5. Interactive approach development for BL-MOSCM with fuzzy demands**

To get the α-Pareto optimal solution of the BL-MOSCM with fuzzy demands initially, the *α*-(BL-MOSCM) is created at an ideal worth of  $\alpha \in$ [0, 1] model (17)-(25). In the interactive methodology, after getting the surpassed solutions by the ∈-constraint strategy and the idea of satisfactoriness, the leader granted the favored solutions that are pleasant in status order alluding to the sufficiency of the favored answers for the follower. Then, the SLDM applies the ∊-constraint method to obtain the solution which is nearest to the favored solution of the FLDM [\(Cancinoa](#page-16-0)  [et al., 2019; Emam, 2013; Osman et al., 2018\)](#page-16-0). At last, the FLDM decides the favored solution of the *α*-(BL-MOSCM) as shown by their satisfactoriness. Then, the congruent favored solution to the *α*-(BL-MOSCM) is acquired ([Cancinoa et al., 2019; Emam, 2013; Osman et al., 2018\)](#page-16-0).

#### *5.1. The FLDM problem*

The FLDM problem of the *α*-(BL-MOSCM) follows as [\(Emam, 2013;](#page-16-0)  [Osman et al., 2018\)](#page-16-0):

### *subjectto*

*subjectto* 

∑*<sup>K</sup> k*=1

∑*<sup>K</sup> k*=1

 $(W_{lk}, X_{kj}, Y_{ki}, Z_{ji})$ 

 $\left[C_{lk}^{1} - \gamma_{C_{lk}}(1-\alpha)\right]W_{lk} + \sum_{k=1}^{K}$ 

 $\left[C_{lk}^{1} - \gamma_{C_{lk}}(1-\alpha)\right]W_{lk} + \sum_{k=1}^{K}$ 

∑*<sup>L</sup> l*=1

∑*<sup>L</sup> l*=1

(26)

(28)

### So, the solution of the FLDM issue is gotten by doing algorithm **I**, as

$$
f_{11} = \sum_{l=1}^{L} \sum_{k=1}^{K} [C_{lk}^{1} - \gamma_{C_{lk}}(1-\alpha)] W_{lk} + \sum_{k=1}^{K} \sum_{i=1}^{I} [C_{ki}^{1} - \gamma_{C_{ki}}(1-\alpha)] Y_{ki},
$$
\n
$$
f_{12} = \sum_{l=1}^{L} \sum_{k=1}^{K} [C_{lk}^{1} - \gamma_{C_{ik}}(1-\alpha)] W_{lk} + \sum_{k=1}^{K} \sum_{j=1}^{J} [C_{kj}^{1} - \gamma_{C_{kj}}(1-\alpha)] X_{kj},
$$
\n
$$
f_{13} = \begin{bmatrix} \sum_{l=1}^{L} \sum_{k=1}^{K} [C_{lk}^{1} - \gamma_{C_{ik}}(1-\alpha)] W_{lk} + \sum_{k=1}^{K} \sum_{j=1}^{J} [C_{kj}^{1} - \gamma_{C_{kj}}(1-\alpha)] X_{kj} \\ + \sum_{j=1}^{J} \sum_{i=1}^{I} [C_{ji}^{1} - \gamma_{C_{ji}}(1-\alpha)] Z_{ji} \end{bmatrix}
$$

$$
(W_{lk}, X_{kj}, Y_{ki}, Z_{ji}) \in G.
$$
 (27)

 $W_{lk}^*, X_{kj}^*, Y_{ki}^*, Z_{ji}^* \Big) =$  $W_{lk}^F, X_{kj}^F, Y_{ki}^F, Z_{ji}^F\Big).$ 

> $\overline{a}$  $\frac{1}{2}$  $\mathbf i$  $\overline{\phantom{a}}$  $\overline{\phantom{a}}$  $\overline{\phantom{a}}$  $\overline{1}$

 $\overline{a}$  $\overline{\phantom{a}}$  $\overline{\phantom{a}}$  $\overline{\phantom{a}}$  $\overline{\phantom{a}}$  $\overline{\phantom{a}}$  $\overline{\phantom{a}}$  $\overline{1}$  ⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎠

 $\mathbf{a}$ 

To get the *α*-Pareto optimal solution of the FLDM; we convert model (26)-(27), by the ∊-constraint method into the following SO-DM problem ([Emam, 2013; Osman et al., 2018](#page-16-0)):

$$
\min_{W_{lk}} f_{13} = \left[\sum_{l=1}^{L} \sum_{k=1}^{K} \left[C_{lk}^{1} - \gamma_{C_{lk}}(1-\alpha)\right] W_{lk} + \sum_{k=1}^{K} \sum_{j=1}^{J} \left[C_{kj}^{1} - \gamma_{C_{kj}}(1-\alpha)\right] X_{kj}\n+ \sum_{j=1}^{J} \sum_{i=1}^{J} \left[C_{ij}^{1} - \gamma_{C_{ji}}(1-\alpha)\right] Z_{ji}\n\right]
$$

∑*<sup>I</sup> i*=1

∑*<sup>J</sup> j*=1

 $\left[C_{kj}^{1} - \gamma_{C_{kj}}(1 - \alpha)\right]$ 

 $\in G$ . (31)

 $[C_{ki}^1 - \gamma_{C_{ki}}(1 - \alpha)]Y_{ki} \leq \delta_{11}$ , (29)

 $\overline{a}$ 

 $X_{kj} \leq \delta_{12}$ , (30)

*5.2. The SLDM problem* 

 $\overline{\phantom{a}}$ 

Based on the idea of BLPP, the first level choice  $W_{lk}^F$  ought to be remembered for the SLDM model; subsequently, the issue of SLDM can be planned as ([Emam, 2013; Osman et al., 2018](#page-16-0)):

*subjectto* 

 $\overline{\phantom{a}}$ 

$$
\left(W_{lk}^F,X_{kj},Y_{ki},Z_{ji}\right)\in\boldsymbol{G}\tag{33}
$$

The ∈-constraint procedure is employed to develop the SO-DM issue of the SLDM as:

$$
\min_{X_{kj}, Y_{ki}, Z_{ji}} \left( \frac{(f_{21})_a}{\sum_{k=1}^K \sum_{j=1}^I [D_{ki}^1 - \gamma_{D_{ki}}(1-\alpha)] Y_{ki} + \sum_{k=1}^K \sum_{j=1}^J [D_{kj}^1 - \gamma_{D_{kj}}(1-\alpha)] X_{kj}}{(f_{22})_a} = \left[ \sum_{\substack{I \\ \text{min} \\ \text{min}}} \sum_{j=1}^I [D_{ji}^1 - \gamma_{D_{ji}}(1-\alpha)] Y_{ki} + \sum_{k=1}^K \sum_{j=1}^J [D_{kj}^1 - \gamma_{D_{kj}}(1-\alpha)] X_{kj}} \right]
$$
\n(32)

#### <span id="page-8-0"></span>*subjectto*

**10.** 

(34)

$$
min f_{22} = \left[ \frac{\sum_{k=1}^{K} \sum_{i=1}^{I} [D_{ki}^{1} - \gamma_{D_{ki}}(1-\alpha)] Y_{ki} + \sum_{k=1}^{K} \sum_{j=1}^{J} [D_{kj}^{1} - \gamma_{D_{kj}}(1-\alpha)] X_{kj}}{+ \sum_{j=1}^{J} \sum_{i=1}^{I} [D_{ji}^{1} - \gamma_{D_{ji}}(1-\alpha)] Z_{ji}} \right]
$$

$$
\sum_{k=1}^{K} \sum_{I=1}^{I} \left[ D_{ki}^{1} - \gamma_{D_{ki}} (1-\alpha) \right] Y_{ki} + \sum_{k=1}^{K} \sum_{j=1}^{J} \left[ D_{kj}^{1} - \gamma_{D_{kj}} (1-\alpha) \right] X_{kj} \ge \delta_{21}, \quad (35)
$$

$$
(W_k^F, X_{kj}, Y_{ki}, Z_{ji}) \in \boldsymbol{G}
$$
 (36)

Our essential idea on treating model (34)-(36) is to acquire the latter level non-inferior solution  $(W_{ik}^F, X_{kj}^S, Y_{ki}^S, Z_{ji}^S)$  that is nearest to the FLDM  $\int$  solution  $\left(W_{lk}^F, X_{kj}^F, Y_{kl}^F, Z_{jl}^F\right)$  utilizing algorithm **I**. Therefore, we will check whether  $(W_{ik}^F, X_{kj}^S, Y_{ik}^S, Z_{ji}^S)$  is a preferred values to the FLDM or it could be modified based on the test [\(Emam, 2013; Osman et al., 2018\)](#page-16-0): If.

$$
\frac{\|F_1\left(W_k^F, X_{kj}^F, Y_{ki}^F, Z_{ji}^F\right) - F_1\left(W_k^F, X_{kj}^S, Y_{ki}^S, Z_{ji}^S\right)\|_2}{\|F_1\left(W_k^F, X_{kj}^S, Y_{ki}^S, Z_{ji}^S\right)\|_2} < \sigma^F
$$
\n(37)

Then,  $(W_{lk}^F, X_{kj}^S, Y_{ki}^S, Z_{jl}^S)$  is a favored answer for the *α*-(BL-MOSCM), where  $\sigma^F$  is a small plus fixed assumed by the FLDM. where  $\delta_{rs}$ ,  $b_{rs}$  and  $a_{rs}$ are defined as [\(Emam, 2013; NabiL et al., 2021; Osman et al., 2018\)](#page-16-0):

### **Algorithm I**.

 $\overline{a}$  $\overline{\phantom{a}}$  $\overline{\phantom{a}}$  $\overline{\phantom{a}}$  $\overline{1}$ 



### **6. Interactive Algorithm for BL-MOSCM under Fuzziness**

Dependent on the study in the past segments, the proposed interactive algorithm will be developed for addressing the BL-MOSCM with fuzzy demands as:



$$
\delta_n = (b_n - a_n)s_r + a_n,
$$
 (r = 1, 2), (t = 1, 2, ..., v\_r), (38)

$$
b_n = \max_{\left(W_{lk}, X_{kj}, Y_{kl}, Z_{jl}\right) \in G} f_n\big(W_{lk}, X_{kj}, Y_{kl}, Z_{jl}\big), (r = 1, 2), (t = 1, 2, ..., \nu_r),
$$
 (39)

$$
a_{rt} = \min_{\left(W_{lk}, X_{kj}, Y_{kl}, Z_{jl}\right) \in G} f_{rt}\left(W_{lk}, X_{kj}, Y_{ki}, Z_{jl}\right), (r = 1, 2), (t = 1, 2, ..., \nu_r),
$$
(40)

where  $s_r$  is the satisfactoriness given by the  $r^{th}$  level DM for the  $t^{th}$ objective function. The preferred solution of the *rth* LDM issue is gotten by utilizing algorithm I:

### **7. Numerical example**

The following case study presented by Gupta et al. (Gupta et al., [2018\)](#page-16-0) is considered to illustrate the suggested interactive process. The SCM comprising of assembling firm having various factories, warehouses, retailers and clients in various geological districts or areas. It is expected that the five suppliers supply is crude material to four assembling factories. The allocation framework comprises of six warehouses where the item is briefly positioned and put to away prior market out eight retailers from which items are sold out too many clients. The fuzzy information has been summed up in Tables from [Tables 2-9:](#page-10-0)

Based on the above datasets of transportation cost and delivery time of the SCM, utilizing the *α*-cut methodology, then the *α*-(BL-MOSCM) can be formulated as:

 $\overline{a}$ 

$$
\begin{pmatrix}\n\text{(f11)}_{\alpha} = \begin{pmatrix}\n(175 + 20\alpha)W_{11} + (280 + 15\alpha)W_{21} + \dots + (257 + 13\alpha)W_{44} + (325 + 15\alpha)W_{54} \\
+(280 + 15\alpha)Y_{11} + (417 + 13\alpha)Y_{12} + \dots + (405 + 15\alpha)Y_{47} + (417 + 13\alpha)Y_{48}\n\end{pmatrix} \\
\text{(f12)}_{\alpha} = \begin{pmatrix}\n(175 + 20\alpha)W_{11} + (280 + 15\alpha)W_{21} + \dots + (257 + 13\alpha)W_{44} + (325 + 15\alpha)W_{54} \\
+(280 + 15\alpha)X_{11} + (133 + 12\alpha)X_{12} + \dots + (280 + 15\alpha)X_{45} + (287 + 13\alpha)X_{46} \\
+(280 + 15\alpha)W_{11} + (280 + 15\alpha)W_{21} + \dots + (257 + 13\alpha)W_{44} + (325 + 15\alpha)W_{54} \\
+(280 + 15\alpha)X_{11} + (133 + 12\alpha)X_{12} + \dots + (257 + 13\alpha)X_{45} + (287 + 13\alpha)X_{46} \\
+(133 + 12\alpha)Z_{11} + (165 + 15\alpha)Z_{12} + \dots + (175 + 15\alpha)Z_{67} + (150 + 15\alpha)Z_{68}\n\end{pmatrix}
$$

### $[2<sup>nd</sup>$ **level**]

$$
\min_{X_{b},Y_{ki},Z_{ji}}\left( \begin{array}{c} (43+2\alpha)Y_{11} + (63+2\alpha)Y_{12} + \ldots + (74+\alpha)Y_{47} + (63+2\alpha)Y_{48} \\ (22+3\alpha)X_{11} + (13+2\alpha)X_{12} + \ldots + (63+2\alpha)X_{45} + (65+5\alpha)X_{46} \\ \min_{X_{b},Y_{ki},Z_{ji}} \end{array} \right) \\ \left( \begin{array}{c} \min \\ (43+2\alpha)Y_{11} + (63+2\alpha)Y_{12} + \ldots + (74+\alpha)Y_{47} + (63+2\alpha)Y_{48} \\ (22+3\alpha)X_{11} + (13+2\alpha)X_{12} + \ldots + (63+2\alpha)X_{45} + (65+5\alpha)X_{46} \\ (12+3\alpha)Z_{11} + (13+2\alpha)Z_{12} + \ldots + (38+2\alpha)Z_{67} + (66+2\alpha)Z_{68} \end{array} \right)
$$

### *subjectto*

 $W_{11} + W_{12} + W_{13} + W_{14} \le (196 - 6a)$ 

 $W_{21} + W_{22} + W_{23} + W_{24} \leq (502 - 12a)$ 

 $W_{31} + W_{32} + W_{33} + W_{34} \leq (220 - 10a)$ 

 $W_{41} + W_{42} + W_{43} + W_{44} \leq (214 - 9a)$ 

 $W_{51} + W_{52} + W_{53} + W_{54} \leq (314 - 14a)$ 

 $Y_{11} + Y_{12} + Y_{13} + Y_{14} + Y_{15} + Y_{16} + Y_{17} + Y_{18} + X_{11} + X_{12} + X_{13} + X_{14} + X_{15} + X_{16}$ ≤ 471*,*

*Y*<sup>21</sup> +*Y*<sup>22</sup> +*Y*<sup>23</sup> +*Y*<sup>24</sup> +*Y*<sup>25</sup> +*Y*<sup>26</sup> +*Y*<sup>27</sup> +*Y*<sup>28</sup> +*X*<sup>21</sup> +*X*<sup>22</sup> +*X*<sup>23</sup> +*X*<sup>24</sup> +*X*<sup>25</sup> +*X*<sup>26</sup> ≤ 296*,*

 $Y_{31}+Y_{32}+Y_{33}+Y_{34}+Y_{35}+Y_{36}+Y_{37}+Y_{38}+X_{31}+X_{32}+X_{33}+X_{34}+X_{35}+X_{36}$ ≤327*,*

*Y*41+*Y*42+*Y*43+*Y*44+*Y*45+*Y*46+*Y*47+*Y*48+*X*41+*X*42+*X*43+*X*44+*X*45+*X*<sup>46</sup> ≤318*,*

 $Z_{11} + Z_{12} + Z_{13} + Z_{14} + Z_{15} + Z_{16} + Z_{17} + Z_{18} \le 154$ ,

 $\mathbf{a}$ 

⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎟⎠

 $Z_{21} + Z_{22} + Z_{23} + Z_{24} + Z_{25} + Z_{26} + Z_{27} + Z_{28} \le 177$ ,

 $Z_{31} + Z_{32} + Z_{33} + Z_{34} + Z_{35} + Z_{36} + Z_{37} + Z_{38} \le 160$ ,

 $Z_{41} + Z_{42} + Z_{43} + Z_{44} + Z_{45} + Z_{46} + Z_{47} + Z_{48} \leq 202$ ,

 $Z_{51} + Z_{52} + Z_{53} + Z_{54} + Z_{55} + Z_{56} + Z_{57} + Z_{58} \le 178$ ,

 $Z_{61} + Z_{62} + Z_{63} + Z_{64} + Z_{65} + Z_{66} + Z_{67} + Z_{68} \leq 218$ ,

 $Z_{11} + Z_{21} + Z_{31} + Z_{41} + Z_{51} + Z_{61} + Y_{11} + Y_{21} + Y_{31} + Y_{41} \geq (85 + 5a)$ 

 $Z_{12} + Z_{22} + Z_{32} + Z_{42} + Z_{52} + Z_{62} + Y_{12} + Y_{22} + Y_{32} + Y_{42} > (46 + 4a)$ 

 $Z_{13} + Z_{23} + Z_{33} + Z_{43} + Z_{53} + Z_{63} + Y_{13} + Y_{23} + Y_{33} + Y_{43} \ge (82 + 3a)$ 

 $Z_{14} + Z_{24} + Z_{34} + Z_{44} + Z_{54} + Z_{64} + Y_{14} + Y_{24} + Y_{34} + Y_{44} \geq (59 + 6a)$ 

 $Z_{15} + Z_{25} + Z_{35} + Z_{45} + Z_{55} + Z_{65} + Y_{15} + Y_{25} + Y_{35} + Y_{45} \geq (58 + 2a)$ 

 $Z_{16} + Z_{26} + Z_{36} + Z_{46} + Z_{56} + Z_{66} + Y_{16} + Y_{26} + Y_{36} + Y_{46} \ge (101 + 4a)$ 

 $Z_{17} + Z_{27} + Z_{37} + Z_{47} + Z_{57} + Z_{67} + Y_{17} + Y_{27} + Y_{37} + Y_{47} \ge (105 + 5\alpha)$ 

<span id="page-10-0"></span>Fuzzy transportation cost from supplier to plant.



### **Table 3**

Fuzzy transportation and production cost of plant to retailer**.** 



#### **Table 4**

Fuzzy transportation and production cost of plant to warehouse.



 $Z_{18} + Z_{28} + Z_{38} + Z_{48} + Z_{58} + Z_{68} + Y_{18} + Y_{28} + Y_{38} + Y_{48} \ge (78 + 2\alpha)$ 

 $W_{11} + W_{21} + W_{31} + W_{41} + W_{51} \ge X_{11} + X_{12} + X_{13} + X_{14} + X_{15} + X_{16} + Y_{11} + Y_{12} + Y_{13}$ 

 $+ Y_{14} + Y_{15} + Y_{16} + Y_{17} + Y_{18}$ 

**Plant Warehouses** 

 $W_{12} + W_{22} + W_{32} + W_{42} + W_{52} \ge X_{21} + X_{22} + X_{23} + X_{24} + X_{25} + X_{26} + Y_{21}$  $+ Y_{22} + Y_{23}$ 

### $+ Y_{24} + Y_{25} + Y_{26} + Y_{27} + Y_{28}$

 $W_{13} + W_{23} + W_{33} + W_{43} + W_{53} \geq X_{31} + X_{32} + X_{33} + X_{34} + X_{35} + X_{36} + Y_{31}$  $+ Y_{32} + Y_{33}$ 

 $+ Y_{34} + Y_{35} + Y_{36} + Y_{37} + Y_{38}$ 

 $W_{14} + W_{24} + W_{34} + W_{44} + W_{54} \geq X_{41} + X_{42} + X_{43} + X_{44} + X_{45} + X_{46} + Y_{41}$  $+ Y_{42} + Y_{43}$ 

 $+ Y_{44} + Y_{45} + Y_{46} + Y_{47} + Y_{48}$ 

 $X_{11} + X_{21} + X_{31} + X_{41} \geq Z_{11} + Z_{12} + Z_{13} + Z_{14} + Z_{15} + Z_{16} + Z_{17} + Z_{18}$ 

 $X_{12} + X_{22} + X_{32} + X_{42} \geq Z_{21} + Z_{22} + Z_{23} + Z_{24} + Z_{25} + Z_{26} + Z_{27} + Z_{28}$ 

 $X_{13} + X_{23} + X_{33} + X_{43} \geq Z_{31} + Z_{32} + Z_{33} + Z_{34} + Z_{35} + Z_{36} + Z_{37} + Z_{38}$ 

 $X_{14} + X_{24} + X_{34} + X_{44} \geq Z_{41} + Z_{42} + Z_{43} + Z_{44} + Z_{45} + Z_{46} + Z_{47} + Z_{48}$ 

 $X_{15} + X_{25} + X_{35} + X_{45} \geq Z_{51} + Z_{52} + Z_{53} + Z_{54} + Z_{55} + Z_{56} + Z_{57} + Z_{58}$ 

$$
X_{16} + X_{26} + X_{36} + X_{46} \geq Z_{61} + Z_{62} + Z_{63} + Z_{64} + Z_{65} + Z_{66} + Z_{67} + Z_{68},
$$

 $W_{lk} \geq 0, X_{kj} \geq 0, Y_{ki} \geq 0, Z_{ji} \geq 0; \forall i, j, l, k$ 

Firstly, we obtain the individual maximum and minimum values for the objective functions at the different values of *α* as indicated in [Table 10](#page-13-0) and [Table 11](#page-13-0), respectively:

The first case at  $\alpha = 0$ , Let  $(G)_{\alpha}$  denote the set of constrains of the above model. Then we formulate and solve the FLDM problem using the ∊-constraint method as:

$$
\min_{W_{lk}} f_{13} = \left( \begin{array}{c} 175W_{11} + 280W_{21} + 472W_{31} + \dots + 189W_{34} + 257W_{44} + 325W_{54} \\ + 280X_{11} + 133X_{12} + 175X_{13} + \dots + 156X_{44} + 280X_{45} + 287X_{46} \\ + 133Z_{11} + 165Z_{12} + 142Z_{13} + \dots + 162Z_{66} + 175Z_{67} + 150Z_{68} \end{array} \right)
$$

#### *subjectto*

$$
\begin{aligned}[t] \left( \begin{matrix} 175 W_{11}+280 W_{21}+472 W_{31}+\cdots+189 W_{34}+257 W_{44}+325 W_{54} \\ +280 Y_{11}+417 Y_{12}+325 Y_{13}+\cdots+371 Y_{46}+405 Y_{47}+417 Y_{48} \end{matrix}\right) \\ <1133337,\end{aligned}
$$

 $(175W_{11} + 280W_{21} + 472W_{31} + \dots + 189W_{34} + 257W_{44} + 325W_{54})$  $\left( +280X_{11} + 133X_{12} + 175X_{13} + \cdots + 156X_{44} + 280X_{45} + 287X_{46} \right)$ ≤ 1105509*,*

 $(W_{lk}, X_{kj}, Y_{ki}, Z_{ji}) \in (G)_{\alpha=0}.$ 

Fuzzy transportation cost from warehouse to retailer.



The above model is solved by using LINGO 18 software, where<br>  $\delta_{11}=$  $(b_{11}-a_{11})s_1 + a_{11}$ 

 $= 1133337$  and  $\delta_{12} = (b_{12} - a_{12})s_1 + a_{12} = 1105509$ , so, the solution of the FLDM is.

$$
\begin{pmatrix}\nW_{22}^F; W_{32}^F; W_{23}^F; W_{14}^F; W_{24}^F; \nX_{kj}^F\\
Y_{22}^F; Y_{23}^F; Y_{25}^F; Y_{27}^F; Y_{26}^F; Y_{36}^F; Y_{41}^F; Y_{44}^F; Y_{48}^F; \\
Z_{ji}^F\n\end{pmatrix} = \begin{pmatrix}\n76; 220; 101; 196; 21 \\
0 & 0 \\
46; 82; 58; 105; 5; 101; 85; 59; 73\n\end{pmatrix} \text{ and } s_1 = 1, \sigma^F = 0.9 \text{ are given by}
$$

the FLDM. Secondly, the SLDM formulated as:

76, 220, 101, 196, 21 76, 220, 101, 196, 21  $\mathbf{0}$ 164, 101, 15, 202  $||F$  $46, 82, 58, 105, 5, 101, 85, 59, 73$ 74,58  $\mathbf{0}$ 82, 82, 15, 19, 105, 78, 11, 31, 59 76, 220, 101, 196, 21  $164, 101, 15, 202$  $||F$  $\parallel_2$  $74,58$ 82, 82, 15, 19, 105, 78, 11, 31, 59

(37), will be used to choose whether the solution

$$
W_{22}^F; W_{23}^F; W_{24}^F; W_{14}^F; W_{24}^F; \nX_{22}^S; X_{36}^S; X_{43}^S; X_{44}^S; \nY_{21}^S; Y_{25}^S; \nZ_{23}^S; Z_{26}^S; Z_{32}^S; Z_{46}^S; Z_{47}^S; Z_{48}^S; Z_{61}^S; Z_{62}^S; Z_{64}^S
$$
\n
$$
= \begin{pmatrix}\n76; 220; 101; 196; 21 \\
164; 101; 15; 202 \\
74; 58 \\
82; 82; 15; 19; 105; 78; 11; 31; 59\n\end{pmatrix}
$$

is acceptable or not:

$$
\textit{minf}_{22} = \begin{pmatrix} 43Y_{11} + 63Y_{12} + 47Y_{13} + \dots + 63Y_{46} + 74Y_{47} + 63Y_{48} \\ 22X_{11} + 13X_{12} + 13X_{13} + \dots + 35X_{44} + 63X_{45} + 65X_{46} \\ 12Z_{11} + 13Z_{12} + 17Z_{13} + \dots + 25Z_{66} + 38Z_{67} + 66Z_{68} \end{pmatrix}
$$

subjectto

$$
\left(\frac{43Y_{11}+63Y_{12}+47Y_{13}+\cdots+63Y_{46}+74Y_{47}+63Y_{48}}{22X_{11}+13X_{12}+13X_{13}+\cdots+35X_{44}+63X_{45}+65X_{46}}\right)\le 106332,
$$

$$
W_{22}^F = 76; W_{32}^F = 220; W_{23}^F = 101; W_{14}^F = 196; W_{24}^F = 21,
$$

 $(X_{kj}, Y_{ki}, Z_{ji}) \in (G)_{a=0}.$ 

where  $\delta_{21} = (b_{21} - a_{21})s_2 + a_{21} = 106332$ , so the SLDM solution is

$$
\begin{pmatrix} W_{22}^F; W_{32}^F; W_{13}^F; W_{14}^F; & W_{24}^F; \\ x_{22}^S; X_{36}^S; X_{43}^S; X_{44}^S; & \\ Y_{21}^S; Y_{25}^S; & Y_{25}^S; \\ Z_{23}^S; Z_{26}^S; Z_{32}^S; Z_{46}^S; Z_{47}^S; Z_{48}^S; Z_{61}^S; Z_{62}^S; Z_{64}^S \end{pmatrix} \\ = \begin{pmatrix} 76;220;101;196;21 \\ 164;101;15;202 \\ 74;58 \\ 82;82;15;19;105;78;11;31;59 \end{pmatrix}
$$

and  $s_2 = 1$ , is given by the SLDM. Now, the FLDM test function, equ.

 $\frac{\sqrt{(313995-114926)^2+(75970-157510)^2+(75970-222848)^2}}{\sqrt{(114926)^2+(157510)^2+(222848)^2}}$  $= 0.8796$  $< 0.9$ 

So

$$
\begin{pmatrix} W_{22}^F; W_{32}^F; W_{23}^F; W_{14}^F; W_{24}^F; \cr X_{22}^S; X_{36}^S; X_{43}^S; X_{44}^S; \cr Y_{21}^S; Y_{25}^S; \cr Z_{23}^S; Z_{26}^S; Z_{32}^S; Z_{46}^S; Z_{47}^S; Z_{48}^S; Z_{61}^S; Z_{62}^S; Z_{64}^S \end{pmatrix} = \\ \begin{pmatrix} 76;220;101;196;21 \cr 164;101;15;202 \cr 74;58 \cr 82;82;15;19;105;78;11;31;59 \end{pmatrix} \text{ is the preferr}
$$

ed solution to the BL-

MOSCM problem. The second case at  $\alpha = 0.5$ , we can formulate and solve SO-DM problem of the FLDM as:

Fuzzy delivery time of item from plant to retailer.



### Table 7

Fuzzy delivery time of item from plant to warehouse.

| Plant | Warehouses     |                |                |                |                |                |  |
|-------|----------------|----------------|----------------|----------------|----------------|----------------|--|
|       | Nı             | $N_2$          | $\mathbf{N}_3$ |                | N5             | N6             |  |
| $G_1$ | (25, 35, 3, 2) | (15, 25, 2, 1) | (15, 25, 2, 1) | (10, 15, 1, 2) | (25, 30, 2, 3) | (25, 28, 2, 4) |  |
| $G_2$ | (35, 45, 2, 1) | (15, 25, 2, 1) | (20, 30, 2, 1) | (25, 30, 2, 3) | (25, 28, 2, 4) | (35, 40, 3, 2) |  |
| $G_3$ | (50, 60, 2, 3) | (55, 65, 3, 2) | (50, 60, 5, 3) | (55, 60, 5, 3) | (55, 65, 3, 2) | (35, 45, 2, 1) |  |
| $G_4$ | (80, 90, 4, 6) | (55, 65, 3, 2) | (40, 50, 5, 8) | (40, 50, 5, 8) | (65, 75, 2, 4) | (70, 80, 5, 3) |  |

### Table 8

Fuzzy delivery time of item from warehouse to retailer.

| Ware<br>houses | Retailers      |                |                |                |                |                |                |                |  |
|----------------|----------------|----------------|----------------|----------------|----------------|----------------|----------------|----------------|--|
|                | $M_1$          | $M_2$          | $M_3$          | $M_{4}$        | $M_5$          | $M_6$          | M <sub>7</sub> | $M_8$          |  |
| $N_1$          | (15, 25, 3, 1) | (15, 19, 2, 1) | (20, 30, 3, 5) | (25, 35, 3, 2) | (20, 30, 1, 2) | (20, 30, 3, 2) | (30, 40, 2, 1) | (30, 32, 5, 3) |  |
| $\mathbf{N}_2$ | (20, 21, 3, 2) | (15, 25, 1, 2) | (20, 30, 4, 5) | (20, 25, 1, 3) | (27, 29, 2, 4) | (27, 29, 2, 4) | (30, 40, 2, 1) | (25, 28, 2, 4) |  |
| $N_3$          | (20, 30, 2, 1) | (15, 25, 2, 1) | (20, 21, 3, 2) | (30, 40, 2, 1) | (30, 33, 2, 1) | (35, 45, 2, 1) | (40, 42, 2, 4) | (35, 40, 3, 2) |  |
| $\mathbf{N}_4$ | (15, 25, 2, 1) | (20, 22, 1, 3) | (20, 22, 2, 3) | (25, 28, 2, 4) | (27, 29, 2, 4) | (26, 28, 4, 3) | (22, 24, 5, 3) | (20, 22, 2, 3) |  |
| $N_{5}$        | (15, 25, 2, 1) | (16, 18, 2, 1) | (15, 17, 2, 1) | (14, 16, 3, 2) | (35, 40, 3, 2) | (34, 36, 2, 4) | (36, 38, 5, 6) | (40, 42, 2, 4) |  |
| $N_6$          | (14, 16, 3, 2) | (10, 15, 1, 2) | (15, 17, 2, 1) | (16, 18, 2, 1) | (30, 32, 5, 3) | (29, 31, 4, 5) | (40, 42, 2, 4) | (68, 72, 2, 4) |  |

$$
\min_{W_{ik}} f_{13}=\left(\begin{array}{c}185W_{11}+287.5W_{21}+481W_{31}+ \ldots +196W_{34}+263.5W_{44}+332.5W_{54}\\+287.5X_{11}+139X_{12}+185X_{13}+ \ldots +163X_{44}+287.5X_{45}+293.5X_{46}\\+139Z_{11}+172.5Z_{12}+151Z_{13}+ \ldots +171Z_{66}+182.5Z_{67}+157.5Z_{68}\end{array}\right.
$$

### subjectto

$$
\begin{pmatrix} 185W_{11} + 287.5W_{21} + 481W_{31} + \dots + 196W_{34} + 263.5W_{44} + 332.5W_{54} \ 287.5Y_{11} + 423.5Y_{12} + 332.5Y_{13} + \dots + 371Y_{46} + 405Y_{47} + 417Y_{48} \ \le 1144537, \end{pmatrix}
$$

$$
\begin{array}{l} \left(185W_{11}+287.5W_{21}+481W_{31}+\cdots+196W_{34}+263.5W_{44}+332.5W_{54}\right) \\ +287.5X_{11}+139X_{12}+185X_{13}+\cdots+163X_{44}+287.5X_{45}+293.5X_{46} \\\le1114414, \end{array}
$$

# $(W_{lk}, X_{kj}, Y_{ki}, Z_{ji}) \in G.$

The above model is solved by using LINGO 18 software, where  $\delta_{11}=$  $(b_{11}-a_{11})s_1+a_{11}=1144537$  and  $\delta_{12}=(b_{12}-a_{12})s_1+a_{12}=1114414$ , so the solution of the FLDM is.  $\ddot{\phantom{a}}$ 

$$
\begin{pmatrix}\nW_{22}^F; W_{32}^F; W_{23}^F; W_{14}^F; W_{24}^F; \nX_{kj}^F\nY_{22}^F; Y_{23}^F; Y_{25}^F; Y_{36}^F; Y_{41}^F; Y_{43}^F; Y_{44}^F; Y_{48}^F; \nZ_{ji}^F\n81; 215; 103; 193; 37.5\n48; 81.5; 59; 107.5; 103; 87.5; 2; 62; 79\n0\n\end{pmatrix}
$$
 and  $s_1 = 1$ ,  $\sigma^F = 0.9$  are

given by the FLDM.

Secondly, the SLDM formulate it's SO-DM problem as:

$$
\textit{minf}_{22} = \begin{pmatrix} 43Y_{11} + 63Y_{12} + 47Y_{13} + \dots + 63Y_{46} + 74Y_{47} + 63Y_{48} \ 22X_{11} + 13X_{12} + 13X_{13} + \dots + 35X_{44} + 63X_{45} + 65X_{46} \ 12Z_{11} + 13Z_{12} + 17Z_{13} + \dots + 25Z_{66} + 38Z_{67} + 66Z_{68} \end{pmatrix}
$$

### subjectto

$$
\begin{pmatrix} 43Y_{11} + 63Y_{12} + 47Y_{13} + \dots + 63Y_{46} + 74Y_{47} + 63Y_{48} \\ 22X_{11} + 13X_{12} + 13X_{13} + \dots + 35X_{44} + 63X_{45} + 65X_{46} \end{pmatrix} \le 108486.5,
$$

$$
W_{22}^F = 81
$$
;  $W_{32}^F = 215$ ;  $W_{23}^F = 103$ ;  $W_{14}^F = 193$ ;  $W_{24}^F = 37.5$ ,

$$
(X_{ki},Y_{ki},Z_{ji})\in G.
$$

where  $\delta_{21}=(b_{21}-a_{21})s_2+a_{21}=108486.5,$  so the SLDM solution is

$$
\begin{pmatrix}\nW_{22}^F; W_{32}^F; W_{23}^F; W_{14}^F; W_{24}^F; \\
X_{22}^S; X_{36}^S; X_{43}^S; X_{44}^S \\
Y_{21}^S; Y_{25}^S; Y_{46}^S; \\
Z_{23}^S; Z_{26}^S; Z_{32}^S; Z_{46}^S; Z_{47}^S; Z_{48}^S; Z_{62}^S; Z_{64}^S\n\end{pmatrix} = \\ \begin{pmatrix}\n81; 215; 103; 193; 37.5 \\
149.5; 103; 7; 202 \\
87.5; 59; 21.5 \\
83.5; 66; 7; 15.5; 107.5; 79; 41; 62\n\end{pmatrix} \text{ and } s_2 = 1, \text{ is given by the SLDM.}
$$

<span id="page-13-0"></span>Right Hand Side Parameters.

| <b>Fuzzy supply</b> | Fuzzy<br>Demand  | <b>Fixed capacity of</b><br>plant | <b>Fixed capacity of</b><br>warehouse |
|---------------------|------------------|-----------------------------------|---------------------------------------|
| (180, 190, 5, 6)    | (90, 95, 5, 6)   | 471                               | 154                                   |
| (480, 490, 10, 12)  | (50, 55, 4, 5)   | 296                               | 177                                   |
| (200, 210, 8, 10)   | (85, 90, 3, 2)   | 327                               | 160                                   |
| (201, 205, 7, 9)    | (65, 70, 6, 7)   | 318                               | 202                                   |
| (290, 300, 12, 14)  | (60, 65, 2, 3)   |                                   | 178                                   |
|                     | (105, 110, 4, 5) |                                   | 218                                   |
|                     | (110, 115, 5, 7) |                                   |                                       |
|                     | (80, 85, 2, 3)   |                                   |                                       |

### **Table 10**

The individual maximum of the objective functions.

|                   | $(f_{11})_{\alpha}$ | $(f_{12})_{\alpha}$ | $(f_{13})_{\alpha}$ | $(f_{21})_{\alpha}$ | $(f_{22})_{\alpha}$ |
|-------------------|---------------------|---------------------|---------------------|---------------------|---------------------|
| $\alpha = 0$      | 1,133,337           | 1,105,509           | 1,220,263           | 106,332             | 118,589             |
| $\alpha =$<br>0.5 | 1,144,537           | 1,114,414           | 1,237,190           | 108486.5            | 121668.2            |
| $\alpha = 1$      | 1,149,130           | 1,117,480           | 1,247,548           | 109,380             | 123,477             |

**Table 11**  The individual minimum of the objective functions.



Now, the FLDM test function, equ. [\(37\),](#page-8-0) will be used to choose whether the solution. ⎛  $\mathbf{a}$ 

 $\Big\}$  $W_{22}^F$ ;  $W_{32}^F$ ;  $W_{23}^F$ ;  $W_{14}^F$ ;  $W_{24}^F$ ;  $X^S_{22}$ ;  $X^S_{36}$ ;  $X^S_{43}$ ;  $X^S_{44}$ *YS* <sup>21</sup>; *Y<sup>S</sup>* <sup>25</sup>; *Y<sup>S</sup>* 46;  $Z_{23}^S; Z_{26}^S; Z_{32}^S; Z_{46}^S; Z_{47}^S; Z_{48}^S; Z_{62}^S; Z_{64}^S$  $\frac{1}{\sqrt{2\pi}}$ =  $\overline{\phantom{a}}$  $\vert$ 81; 215; 103; 193; 37*.*5 149*.*5; 103; 7; 202 87*.*5; 59; 21*.*5 83*.*5; 66; 7; 15*.*5; 107*.*5; 79; 41; 62  $\mathbf{a}$  $\vert$ is acceptable or not:



$$
\sqrt{(332586.25 - 136326.75)^2 + (83559.5 - 148110.5)^2 + (83559.5 - 218258)^2}
$$
  
= 0.83  $\lt$  0.9

$$
= 0.65 <
$$

$$
So
$$

$$
\begin{pmatrix}\nW_{22}^F; W_{32}^F; W_{23}^F; W_{14}^F; W_{24}^F; \\
X_{22}^S; X_{36}^S; X_{43}^S; X_{44}^S \\
Y_{21}^S; Y_{25}^S; Y_{46}^S; \\
Z_{23}^S; Z_{26}^S; Z_{32}^S; Z_{46}^S; Z_{47}^S; Z_{48}^S; Z_{62}^S; Z_{64}^S\n\end{pmatrix} = \begin{pmatrix}\n81; 215; 103; 193; 37.5 \\
149.5; 103; 7; 202 \\
87.5; 59; 21.5 \\
83.5; 66; 7; 15.5; 107.5; 79; 41; 62\n\end{pmatrix}
$$
 is the preferred solution to the

BL-MOSCM problem.

The third case at  $\alpha = 1$ , the crisp BL-MOSCM can be formulate as:

$$
\underset{W_{lk}}{\text{min}}f_{13}=\begin{pmatrix}195W_{11}+295W_{21}+490W_{31}+ \ldots +203W_{34}+270W_{44}+340W_{54}\\ +295X_{11}+145X_{12}+195X_{13}+ \ldots +170X_{44}+295X_{45}+300X_{46}\\ +145Z_{11}+180Z_{12}+160Z_{13}+ \ldots +180Z_{66}+190Z_{67}+165Z_{68} \end{pmatrix}
$$

### *subjectto*

$$
\begin{array}{l} \left( \frac{195 W_{11}+295 W_{21}+490 W_{31}+\dots+203 W_{34}+270 W_{44}+340 W_{54}}{295 Y_{11}+430 Y_{12}+340 Y_{13}+\dots+385 Y_{46}+420 Y_{47}+430 Y_{48}} \right) \\ \le 1149130, \end{array}
$$

$$
\begin{array}{l} \left( \begin{array}{l} 195W_{11}+295W_{21}+490W_{31}+\cdots+203W_{34}+270W_{44}+340W_{54} \\ +295X_{11}+145X_{12}+195X_{13}+\cdots+170X_{44}+295X_{45}+300X_{46} \end{array} \right) \\ \le 1117480, \end{array}
$$

$$
\big(W_{lk},X_{kj},Y_{ki},Z_{ji}\big)\in\boldsymbol{G}.
$$

The above model is solved by using LINGO 18 software, where



<span id="page-14-0"></span>Allocated Optimal Quantity.



## Table 13

 $\overline{ }$ 





 $\delta_{11}=(b_{11}-a_{11})s_1+a_{11}=1149130 \text{ and } \delta_{12}=(b_{12}-a_{12})s_1+a_{12}=$ 1117480, so the solution of the FLDM is.

$$
\begin{pmatrix}\nW_{22}^F; W_{23}^F; W_{32}^F; W_{14}^F; W_{24}^F; \nX_{kj}^F; \nY_{22}^F; Y_{25}^F; Y_{25}^F; Y_{36}^F; Y_{41}^F; Y_{43}^F; Y_{44}^F; Y_{48}^F; \\
Z_{ji}^F; & Z_{ji}^F; \\
50; 76; 60; 110; 105; 90; 9; 65; 80\n\end{pmatrix} \text{ and } s_1 = 1, \sigma^F = 0.9 \text{ are given by}
$$

the FLDM. Secondly, the SLDM problem formulated as:

$$
\textit{minf}_{22} = \begin{pmatrix} 45Y_{11} + 65Y_{12} + 50Y_{13} + \dots + 65Y_{46} + 75Y_{47} + 65Y_{48} \\ 25X_{11} + 15X_{12} + 15X_{13} + \dots + 40X_{44} + 65X_{45} + 70X_{46} \\ 15Z_{11} + 15Z_{12} + 20Z_{13} + \dots + 29Z_{66} + 40Z_{67} + 68Z_{68} \end{pmatrix}
$$

subjectto

$$
\begin{pmatrix} 45Y_{11} + 65Y_{12} + 50Y_{13} + \dots + 65Y_{46} + 75Y_{47} + 65Y_{48} \ 25X_{11} + 15X_{12} + 15X_{13} + \dots + 40X_{44} + 65X_{45} + 70X_{46} \end{pmatrix} \le 109380,
$$

$$
W_{22}^F = 86; W_{32}^F = 210; W_{23}^F = 105; W_{14}^F = 190; W_{24}^F = 54,
$$

 $(X_{kj}, Y_{ki}, Z_{ji}) \in G.$ 

where  $\delta_{21} = (b_{21} - a_{21})s_2 + a_{21} = 109380$ , so the SLDM solution is

$$
\left(\begin{array}{c}W_{22}^F;W_{23}^F;W_{32}^F;W_{44}^F;W_{24}^F; \\ X_{22}^S;X_{36}^S;X_{44}^S; \\ Y_{21}^S;Y_{25}^S;Y_{46}^S \\ Z_{23}^S;Z_{24}^S;Z_{26}^S;Z_{47}^S;Z_{48}^S;Z_{62}^S;Z_{63}^S \end{array}\right)=\left(\begin{array}{c} 86;105;210;190;54 \\ 146;105;190 \\ 90;60;54 \\ 30;65;51;110;105;80;50;55 \end{array}\right)
$$

and  $s_2 = 1$ , is given by the SLDM. Now, the FLDM test function, equ. (37), will be used to choose whether the solution

 $90, 60, 54$  $30; 65; 51; 110; 105; 80; 50; 55$ 

$$
\frac{\sqrt{(351875 - 159065)^2 + (91475 - 172270)^2 + (91475 - 246000)^2}}{\sqrt{(159065)^2 + (172270)^2 + (246000)^2}} = 0.7649
$$
  
< 0.9

$$
\text{So} \begin{pmatrix} W_{22}^F; W_{23}^F; W_{32}^F; W_{14}^F; W_{24}^F; \\ X_{22}^S; X_{36}^S; X_{44}^S; \\ Y_{21}^S; Y_{25}^S; Y_{46}^S; \\ Z_{23}^S; Z_{24}^S; Z_{26}^S; Z_{47}^S; Z_{48}^S; Z_{62}^S; Z_{63}^S \end{pmatrix} = \begin{pmatrix} 86;105;210;190;54 \\ 146;105;190 \\ 90;60;54 \\ 30;65;51;110;80;50;55 \end{pmatrix} \text{ is}
$$

the preferred solution to the BL-MOSCM problem.

The rapprochement between the suggested interactive methodology and the method exhibited by Gupta et al. (Gupta et al., 2018) is specified in Table 13. The outcomes displayed that the compromise solution of the suggested interactive approach is greatly preferred to the FGP approach proposed by Gupta et al. (Gupta et al., 2018). Also, the interactive approach gives the DM the merit of indicate inclinations during the <span id="page-15-0"></span>solution operation, not at all like the FGP approach. The upside of articulating inclinations by DM during the solution operation is promising in actual applications as it allows the DM the opportunity of associating with the analyst.

**Discussion:** The [Tables 12 and 13](#page-14-0) gives the optimal values of the objective functions at different values of  $\alpha \in [0, 1]$  alongside optimal order allocation from source to factory, factory to the retailer, plant to stockroom and distribution center to retailer respectively. Particularly,  $a = 0$  specify the broadest least chance, showing that the target function won't at any point fall outside of this reach while at the opposite finish of  $\alpha = 1$ , it offers the most likely benefit of the goal. It is seen that transportation sum may change at a few upsides of *α*.

A SCN comprises of an expansive organization for the equip of material from the source to plant, and afterward plant to the retailer, while the remainder of the material moved from plant to stockroom, and afterward shipped from distribution center to retailer as indicated by the interest of the market. The issue considered in this paper is a genuine multi-objective issue looked by the operational supervisor in an assembling unit, where they need to limit the transportation cost and conveyance time respectively. The proposed BL-MOSCN for request distribution considers yearly demand from retailers and likely limit of provider and stockroom with various expense capacities and conveyance time. This study assists the DM to dissect the situations of uncertain judgment in SCN when client's requests and supplies of the item are under ambiguity. In the presented BL-MOSCN model a specific *α*-level is adopted to represent the confidence level on DMs' subjective uncertainty to specify parameter values in the *α*-(BL-MOSCM). For simplification, the  $\alpha$ -level for all parameters in the solution process are consider the same. However, these may be limitations in practical applications. The determination of  $\alpha$ -levels for various DMs' subjective uncertainties could be different in the real world, due to DMs' different consideration of the corresponding objective functions. Thus, we solve the *α*-(BL-MOSCM) for different values of level sets.

### **8. Conclusion**

The issue considered in this paper is a genuine MOPP looked by the functional administrator in an assembling unit, where they need to minimize the transportation cost and delivery time, respectively. The proposed BL-MOSCM with fuzzy parameters for request distribution considers yearly interest from retailers and potential limits of provider and stockroom with various expense functions and delivery time. The primary goal of this paper is to foster an interactive approach that minimizes the whole transportation cost and delivery time, respectively. The uniqueness of the model lies in its capacity to think about dubiousness sought after and supply parameters. The idea of the  $\alpha$ -level is utilized to deal with the vagueness by considering of all TFNs. An illustrative case study is presented to show the suggested interactive methodology for tackling BL-MOSCM with fuzzy parameters. The competence and applicability of the suggested interactive approach is verified via comparison with the existing methods. It is expected that, this research will further accelerate the benefit in treating BLPP more in this field of SCN.

Novel findings and recommendations in the present study is that the interactive approach gives the DM the merit to indicate inclinations during the solution operation, which is totally different from the FGP approach. The upside of articulating inclinations by DM during the solution operation is promising in actual applications as it allows the DM the opportunity of associating with the analyst. Moreover, the uncertain BL-MOSCM is more genuine than the conventional deterministic one. Coming up next are a few findings and recommendations drawn from the proposed study which is supportive for any managers in assembling unit:

• The proposed model assists the DM in minimizing transportation expenses and conveyance time of large SCN.

- This study assists the DM to dissect the situations of vulnerability judgment in SCN when client's requests and supplies of the item are under ambiguity.
- The model also, assists the DM in concocting a decent appropriation methodology.
- It likewise helps DMs in the investigation of the outcomes acquired under a certain also questionable climate in the SCN and gives the thoughts how to function with such sort of surprising circumstances.

The major limitation, which is computational complexity, of the proposed BL-MOSCM with fuzzy parameters is that a specific *α*-level is adopted in the proposed methods to represent the confidence level on DMs' subjective uncertainty to specify parameter values in the BL-MOSCM. For simplicity, the *α*-level for all parameters of the BL-MOSCM are assumed to be the same. However, there may be limitations in real-world models. The determination of *α*-levels for various DMs' subjective uncertainties could be different in the real world due to DMs' different consideration of the real SCN data. Also, the current mathematical examination, a theoretically built SCN have been considered. The proposed model restricted to dubiousness just, yet in true issues, the DM needs to confront probabilistic and multi-choices circumstances.

Several open points for future research in BL-MOSCM, from our point of view, to be studied in the future are:

- 1. The study of BL-MOSCM in rough environment is an active point to be considered.
- 2. Real-world case studies of BL-MOSCM are a vital field in the future research, and.
- 3. BL-MOSCM with multi-choice parameters is an interesting topic to be investigated.

### **CRediT authorship contribution statement**

**M.A. El Sayed:** Conceptualization, Methodology, Software, Supervision. **F.A. Farahat:** Visualization, Investigation, Writing – review & editing. **M.A. Elsisy:** Visualization, Investigation, Writing – review & editing.

### **Declaration of Competing Interest**

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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