

Fractional Multi-objective Capacitated Transportation Problem with Different Membership Functions

¹Sheema Sadia, ²Qazi Mazhar Ali, ³Zainab Asim, ^{4,*}Ahteshamul Haq

•

^{1,2,4}Department of Statistics & Operations Research Aligarh Muslim University, Aligarh-202002

³Faculty of Commerce & Management, SGT University, Gurgaon, Haryana

¹sadia.sheema63@gmail.com, ²qaziali88@gmail.com, ³asmizainab90@gmail.com,

^{4,*}a.haq@myamu.ac.in *Corresponding author

Abstract

This Fractional Transportation Problem arises when an enterprise has to face the issue of maintaining a good ratio of some critical parameters. These parameters are directly concerned with product(s) transportation from sources to destination. This paper considers a multi-objective Capacitated Transportation Problem with Fractional Objectives. A fuzzy goal programming approach with different membership functions is applied to generate a different set of solutions. We also use Chebyshev's Goal Programming for obtaining the solutions. Finally, a numerical illustration is provided to validate our proposed model.

Keywords: Multi-objective programming, Quadratic membership function, Mixed constraints, Fuzzy normal membership function, Fuzzy Cauchy membership function, Fuzzy programming

1. Introduction

A transportation problem (TP) occurs when a product (or products) must be transported from multiple sources (also known as origin, supply, or capacity centres) to multiple sinks (also called destination, demand or requirement centres). The fundamental TP was devised by Alfred Hitchcock [9]. The TP with fractional objective function is known as a fractional transportation problem (FTP). Swarup [14] was the first to propose it. It is crucial in logistics, supply chain management, stock cutting problems, resource allocation problems, ship and plane routing problems, cargo loading problems, and inventory problems. The FTP arises when an enterprise faces the challenge of maintaining a good ratio between critical parameters. These parameters are directly concerned with transporting a product or products from their origin to their destination. Fractional programming can optimize actual/standard transportation costs or total return/total investment on machines delivered from factories to workshops. In linear fractional TPs with mixed constraints, Gupta *et al.* [5] presented a paradox. Gupta and Arora [6-7] and Liu [10] are two other authors written about FTPs. In general, real-world TPs are modelled with multiple, conflicting objectives.

Furthermore, combining all objective functions into a single overall utility function is difficult for the decision-maker. So it is better to formulate a multi-objective TP. The capacitated TP are the TPs with bounds on general availabilities at assets and general vacation spot requirements. It may benefit telecommunication networks, production-distribution systems, rail and concrete street systems.

The capacitated TPs have also been discussed by authors like Arora and Gupta [2] and Gupta and Bari [8]. Zadeh [15] first delivered the idea of a fuzzy set concept. Then Zimmermann [16] carried out the fuzzy set concept with a few suitable membership functions to resolve linear programming problems with numerous goal functions. Bit *et al.* [3] implemented a fuzzy programming approach with a linear membership function to resolve the multi-objective TP. El-Wahed [4] gave the idea of a fuzzy programming approach to determine the optimal compromise solution of a MOTP with a fuzzy membership function. Akkapeddi [1] discussed the quadratic membership for the multi-objective TP. Singh [13] worked on multiple objective fractional costs TP with bottleneck time and impurities. Sadia *et al.* [12] presented a fuzzy approach to obtain the solution of multi-objective capacitated FTP. Fuzzy normal and fuzzy Cauchy membership functions were used by Mon and Cheng [11]. Gupta *et al.* [17] discussed two stage transportation problem with the different types of fuzzy environments. Kamal *et al.* [18] described the parameters estimation and goodness of fit for the multi-objective transportation problem under type-2 trapezoidal fuzzy numbers. The purpose of using FTP is to make the problem more realistic. It can prove more beneficial for the decision-maker to consider the proportion of transporting cost due to the covered path and favoured path because the transportation cost may vary due to the travelled and favoured path. Likewise, the proportion of exact and standard transportation time and transporting damage cost due to covered path and favoured path are also measured.

In this paper, we have taken mixed constraints of MOCFTP with fractional type objectives. As it is a multi-objective problem and the objectives are conflicting in nature. So a compromise solution is obtained by using the fuzzy programming approach. We have tried to use three membership functions: quadratic, fuzzy normal, and fuzzy Cauchy. As far as our knowledge, these membership functions have never been used to deal with TPs. The rest of the paper is organized as follows: Assumptions, notations and formulation are discussed in Section 2. In Section 3, we have discussed the algorithm using a fuzzy optimization approach with different membership functions and Chebyshev's Goal Programming. In section 4, an example of the proposed method is illustrated. The conclusion is presented in section 5.

2. Assumptions, notations and formulation of the problem

We consider mixed constraints MOCFTP under the following notations

2.1 Notations

m	Number of origins
n	Number of destinations
a_i	Units of supply ($i = 1, 2, \dots, m$)
b_j	Units of demands $j = 1, 2, \dots, n$
c_{ij}	Unit transporting cost due to travelled route from the i^{th} starting point to j^{th} endpoint.
r_{ij}	Unit transporting cost due to preferred route from the i^{th} starting point to j^{th} endpoint
t_{ij}^a	Actual transportation time from the i^{th} starting point to j^{th} endpoint
t_{ij}^s	Standard transportation time from the i^{th} starting point to j^{th} endpoint
d_{ij}	Damage transporting cost due to travelled origin from the i^{th} path to j^{th} endpoint
x_{ij}	Units transported from the i^{th} starting point to j^{th} endpoint
l_{ij}	Minimum quantity transported from the i^{th} starting point to j^{th} endpoint
s_{ij}	Maximum transported quantity from the i^{th} starting point to j^{th} endpoint

2.2 Problem's statement

Consider a TP of fractional type objective function with m numbers of starting points having $a_i (i = 1, 2, \dots, m)$ units of supply to be transported among n numbers of endpoints with $b_j (j = 1, 2, \dots, n)$ units of demand. The problem is determining the best transportation schedule for transporting the available quantity of products to meet demand while minimizing total transportation costs, time, and damage charges.

Let x_{ij} be the number of units transported from i^{th} starting point to the j^{th} endpoint. The mathematical model of the MOCFTP with mixed constraints can be expressed as:

$$\begin{aligned} \text{Minimize } f_1 &= \frac{\sum_{i=1}^m \sum_{j=1}^n c_{ij} x_{ij}}{\sum_{i=1}^m \sum_{j=1}^n r_{ij} x_{ij}} \\ \text{Minimize } f_2 &= \max \left\{ \frac{t_{ij}^a | x_{ij} > 0}{t_{ij}^s | x_{ij} > 0} \right\} \\ \text{Minimize } f_3 &= \frac{\sum_{i=1}^m \sum_{j=1}^n d_{ij} x_{ij}}{\sum_{i=1}^m \sum_{j=1}^n r_{ij} x_{ij}} \\ \text{subject to: } &\sum_{i=1}^m x_{ij} \leq a_i; \sum_{j=1}^n x_{ij} \geq b_j \\ &l_{ij} \leq x_{ij} \leq s_{ij}; x_{ij} \geq 0 \end{aligned}$$

2.3 Interpretation of objectives function

1. The proportion of unit transporting cost c_{ij} and r_{ij} due to travelled path and a preferred route respectively.
2. The proportion of the actual transportation time t_{ij}^a and a standard transportation time t_{ij}^s .
3. The proportion of unit transporting damage cost d_{ij} (loss of quantity and quality transportation) and r_{ij} due to the travelled and a preferred path, respectively.

3. Solution Approach for MOCFTP

3.1 Fuzzy Optimization Approach-Algorithm:

In order to solve the multiobjective fractional capacitated TP with mixed constraints, we use the following algorithm

Step 1:- Firstly, we will formulate the payoff matrix as:-

$$\begin{array}{c} \text{Payoff} \\ \text{Matrix} \end{array} = \begin{array}{ccc} f_1 & f_2 & f_3 \end{array}$$

$$\begin{array}{c} x_{ij}^{(1)} \\ x_{ij}^{(2)} \\ \vdots \\ x_{ij}^{(k)} \end{array} \begin{bmatrix} f_1(x_{ij}^{(1)}) & f_1(x_{ij}^{(1)}) & f_1(x_{ij}^{(1)}) \\ f_1(x_{ij}^{(1)}) & f_1(x_{ij}^{(1)}) & f_1(x_{ij}^{(1)}) \\ \vdots & \vdots & \vdots \\ f_1(x_{ij}^{(1)}) & f_1(x_{ij}^{(1)}) & f_1(x_{ij}^{(1)}) \end{bmatrix}$$

where, $x_{ij}^{(k)}$; $k = 1, 2, \dots, K$ are the k^{th} individual optimal solutions that optimize the k^{th} objective.

Step 2:- We will apply the fuzzy approach with the following membership functions defined below:

A. Quadratic membership function: To derive the compromise solution of MOCFTP, we used fuzzy programming. The membership functions for the cost objective are: f_{kl} and f_{ku} be the achieved aspired level and the highest acceptance level of the k^{th} objective function, respectively. The membership function of the k^{th} objective function is represented as follows:

$$\mu_k(f_k) = q_{k1}f_k^2 + q_{k2}f_k + q_3$$

The membership values of the k^{th} objective function at the aspiration level and the highest acceptable level is 1 and 0, respectively. We used the equations as:

$$\begin{aligned} \mu_k(f_{kl}) &= q_{k1}f_{kl}^2 + q_{k2}f_{kl} + q_3 = 1 \\ \mu_k(f_{ku}) &= q_{k1}f_{ku}^2 + q_{k2}f_{ku} + q_3 = 0 \end{aligned}$$

The above linear system of equations q_{k2} and q_{k3} are expressed in terms of q_{k1} . Thus, the quadratic membership function for the k^{th} objective function is used in the following form:

$$\mu_k^Q(F_k) = \frac{f_{ku}-f_k}{f_{ku}-f_{kl}} + q_{k1}f_k^2 - q_{k1}(f_{kl} + f_{ku})f_k + q_{k1}f_{kl}f_{ku}$$

B. Fuzzy Normal: The membership function for Fuzzy Normal will take the following form:

$$\mu_k^{FN}\{F_k\} = \begin{cases} 1 & \text{if } f_k \leq f_{kl} \\ \exp\left[-k\left(\frac{f_k-f_{kl}}{f_{ku}-f_{kl}}\right)^2\right] & \text{if } f_{kl} < f_k < f_{ku} \\ 0 & \text{if } f_k \geq f_{ku} \text{ and } k \geq 0 \end{cases}$$

C. Fuzzy Cauchy: The membership function for Fuzzy Cauchy will take the following form:

$$\mu_k^{FC}\{F_k\} = \begin{cases} 1 & \text{if } f_k \leq f_{kl} \\ \frac{1}{1+\alpha\left(\frac{f_k-f_{kl}}{f_{ku}-f_{kl}}\right)^\beta} & \text{if } f_{kl} < f_k < f_{ku} \\ 0 & \text{if } f_k \geq f_{ku} \end{cases}$$

$\alpha \geq 0$ and β is positive even

Step 3: The MOCFTP with mixed constraints can now be converted into equivalent non-linear models for the above-defined membership functions as follow:

A. Quadratic Membership function: The proposed model for MOCFTP with mixed constraints on applying quadratic membership function will be of the following form:

Minimize λ

Subject to

$$\begin{aligned} \frac{f_{1u}-f_1}{f_{1u}-f_{1l}} + q_{11}f_1^2 - q_{11}(f_{1l} + f_{1u})f_1 + q_{11}f_{1l}f_{1u} &\leq \lambda \\ \frac{f_{2u}-f_2}{f_{2u}-f_{2l}} + q_{21}f_2^2 - q_{21}(f_{2l} + f_{2u})f_2 + q_{21}f_{2l}f_{2u} &\leq \lambda \\ \frac{f_{3u}-f_3}{f_{3u}-f_{3l}} + q_{31}f_3^2 - q_{31}(f_{3l} + f_{3u})f_3 + q_{31}f_{3l}f_{3u} &\leq \lambda \\ \sum_{i=1}^m x_{ij} \{ \leq / = / \geq \} a_i; \sum_{j=1}^n x_{ij} \{ \leq / = / \geq \} b_j \\ 0 \leq x_{ij} \leq s_{ij}; x_{ij} \geq 0; \lambda \geq 0 \end{aligned}$$

B. Fuzzy Normal Membership Function: The proposed model for MOCFTP with mixed constraints on applying fuzzy normal membership function will be of the form:

$$\begin{aligned} &\text{Minimize } \lambda \\ &\text{subject to:} \\ &\exp \left[-k \left(\frac{f_1 - f_{1l}}{f_{1u} - f_{1l}} \right)^2 \right] \leq \lambda, \exp \left[-k \left(\frac{f_2 - f_{2l}}{f_{2u} - f_{2l}} \right)^2 \right] \leq \lambda \\ &\exp \left[-k \left(\frac{f_3 - f_{3l}}{f_{3u} - f_{3l}} \right)^2 \right] \leq \lambda \\ &\sum_{i=1}^m x_{ij} \leq a_i; \sum_{j=1}^n x_{ij} \geq b_j; 0 \leq x_{ij} \leq s_{ij}; x_{ij} \geq 0; \lambda \geq 0 \end{aligned}$$

We will solve it for $k=1$

C. Fuzzy Cauchy Membership Function: The proposed model for MOCFTP with mixed constraints on applying fuzzy Cauchy membership function will be of the form:

$$\begin{aligned} &\text{Minimize } \lambda \\ &\text{Subject to } \frac{1}{1 + \alpha \left(\frac{f_1 - f_{1l}}{f_{1u} - f_{1l}} \right)^\beta} \leq \lambda \\ &\frac{1}{1 + \alpha \left(\frac{f_2 - f_{2l}}{f_{2u} - f_{2l}} \right)^\beta} \leq \lambda \\ &\frac{1}{1 + \alpha \left(\frac{f_3 - f_{3l}}{f_{3u} - f_{3l}} \right)^\beta} \leq \lambda \\ &\sum_{i=1}^m x_{ij} \leq a_i; \sum_{j=1}^n x_{ij} \geq b_j; 0 \leq x_{ij} \leq s_{ij}; x_{ij} \geq 0; \lambda \geq 0 \end{aligned}$$

D. Chebyshev's Goal Programming: Chebyshev's Goal Programming is considered a particular case of the weighted Goal Programming technique. It seeks a solution that minimizes the worst deviation from each objective. The mixed constraints of the MOCFTP using Chebyshev's Goal Programming will be represented as:

$$\begin{aligned} &\text{Maximize } \lambda \\ &\text{Subject to } f_1 + \lambda \leq f_{1u} \\ &\quad f_2 + \lambda \leq f_{2u} \\ &\quad f_3 + \lambda \leq f_{3u} \\ &\quad \sum_{i=1}^m x_{ij} \{ \leq / = / \geq \} a_i; \sum_{j=1}^n x_{ij} \{ \leq / = / \geq \} b_j \\ &\quad 0 \leq x_{ij} \leq s_{ij}; x_{ij} \geq 0; \lambda \geq 0 \end{aligned}$$

where, the worst deviation level (λ) and aspiration levels for the upper bound is f_{iu} ($i = 1, 2, 3$).

4. Numerical Illustration

A case study is discussed to demonstrate and utility of the approaches. The numerical problem of simulated data (Sadia *et al.* [12]) is presented. The discussed models are defined to solve the problem. We consider three starting points and three endpoints. The fractional transportation cost, time and damage charges (both quantity and quality damage) are represented in Table [1-3].

Table 1: Cost charges matrix

	b₁	b₂	b₃	Supply
a₁	5/3	7/4	15/13	≤ 12
a₂	8/12	17/14	12/7	= 15
a₃	19/15	10/6	13/8	≥ 20
Demand	≥ 9	= 13	≤ 21	

Table 2: Time charges matrix

	b₁	b₂	b₃	Supply
a₁	17/9	5/2	10/3	≤ 12
a₂	1/2	11/4	6/5	= 15
a₃	13/8	16/12	10/11	≥ 20
Demand	≥ 9	= 13	≤ 21	

Table 3: Damage charges matrix

	b₁	b₂	b₃	Supply
a₁	13/8	15/9	8/11	≤ 12
a₂	11/15	14/6	19/7	= 15
a₃	9/7	15/6	8/17	≥ 20
Demand	≥ 9	= 13	≤ 21	

The mixed constraints of the MOCFTP will be as follows:

$$\begin{aligned} \text{Min} f_1 &= \frac{5x_{11}+7x_{12}+15x_{13}+8x_{21}+17x_{22}+12x_{23}+19x_{31}+10x_{32}+13x_{33}}{3x_{11}+4x_{12}+13x_{13}+12x_{21}+14x_{22}+7x_{23}+15x_{31}+6x_{32}+8x_{33}} \\ \text{Min} f_2 &= \frac{13x_{11} + 15x_{12} + 8x_{13} + 15x_{21} + 14x_{22} + 19x_{23} + 9x_{31} + 15x_{32} + 8x_{33}}{8x_{11} + 9x_{12} + 11x_{13} + 15x_{21} + 6x_{22} + 7x_{23} + 7x_{31} + 6x_{32} + 17x_{33}} \\ \text{Min} f_3 &= \frac{17x_{11} + 5x_{12} + 10x_{13} + x_{21} + 11x_{22} + 6x_{23} + 13x_{31} + 16x_{32} + 10x_{33}}{9x_{11} + 2x_{12} + 3x_{13} + 2x_{21} + 4x_{22} + 5x_{23} + 8x_{31} + 12x_{32} + 11x_{33}} \\ \text{Subject to } &\sum_{j=1}^3 x_{1j} \leq 12; \sum_{j=1}^3 x_{2j} \leq 15; \sum_{j=1}^3 x_{3j} \leq 20 \\ &\sum_{j=1}^3 x_{i1} \leq 9; \sum_{j=1}^3 x_{i2} \leq 13; \sum_{j=1}^3 x_{i3} \leq 21 \quad 0 \leq x_{11} \leq 6, 0 \leq x_{12} \leq 7, 0 \leq x_{13} \leq 13, 0 \leq x_{21} \leq 6, \\ &0 \leq x_{22} \leq 2, 0 \leq x_{23} \leq 13, 0 \leq x_{31} \leq 4, 0 \leq x_{32} \leq 7, 0 \leq x_{33} \leq 14. \end{aligned}$$

A. Different membership functions for fuzzy programming approach

The payoff matrix for $[l_{ij} = 0]$ is obtained after solving the problem as a single objective (ignoring the other objectives) using the LINGO optimization software will be as follows:

$$\begin{aligned} \text{Payoff Matrix} &= f_1 \quad f_2 \quad f_3 \\ x_{ij}^{(1)} &\begin{bmatrix} 1.316832 & 1.16129 & 1.34472 \\ 1.37988 & 1.068410 & 1.79661 \\ 1.406433 & 1.170886 & 1.168285 \end{bmatrix} \\ x_{ij}^{(2)} & \\ x_{ij}^{(3)} & \end{aligned}$$

$$f_{1u} = 1.406433, f_{1l} = 1.316832, f_{2u} = 1.170886, \\ f_{2l} = 1.068410, f_{3u} = 1.79661 \text{ and } f_{3l} = 1.168285$$

Individual optimum solutions are obtained by solving the above problem separately for each objective using the optimizing software LINGO in Table 4.

Table 4: Individual optimum solution

Objectives		Cost	Damage	Time
Objective Values		1.316832	1.068410	1.168285
Allocations	x_{11}	0	0	0
	x_{12}	4	7	6
	x_{13}	5	0	0
	x_{21}	2	6	6
	x_{22}	6	2	0
	x_{23}	7	7	9
	x_{31}	4	3	3
	x_{32}	7	4	7
	x_{33}	9	14	12

The compromise solution obtained for **Quadratic Membership Function** is as follows: $x_{11}^* = 0, x_{12}^* = 7, x_{13}^* = 2, x_{21}^* = 6, x_{22}^* = 2, x_{23}^* = 7, x_{31}^* = 4, x_{32}^* = 4, x_{33}^* = 12$

The optimal compromise solution obtained using the **Fuzzy normal Membership Function** will be as follows: $x_{11}^* = 0, x_{12}^* = 4, x_{13}^* = 1, x_{21}^* = 5, x_{22}^* = 2, x_{23}^* = 8, x_{31}^* = 4, x_{32}^* = 7, x_{33}^* = 9$

The crisp problem for fuzzy Cauchy has been obtained after setting $\alpha = 0.5$ and $\beta = 2$. The compromise solution obtained for **Fuzzy Cauchy Membership Function** is as follows: $x_{11}^* = 4, x_{12}^* = 4, x_{13}^* = 4, x_{21}^* = 5, x_{22}^* = 2, x_{23}^* = 8, x_{31}^* = 4, x_{32}^* = 7, x_{33}^* = 9$

The compromise solution obtained for **Chebyshev's Goal Programming** is as follows: $x_{11}^* = 0, x_{12}^* = 7, x_{13}^* = 2, x_{21}^* = 6, x_{22}^* = 2, x_{23}^* = 7, x_{31}^* = 4, x_{32}^* = 4, x_{33}^* = 12$

5. Conclusion

This article represents the optimal compromise solution with mixed constraints for a multiobjective fractional capacitated TP. Fuzzy programming with three different membership functions viz. quadratic, fuzzy normal and fuzzy Cauchy is used to obtain a compromise solution using a fuzzy programming approach, and Chebyshev's Goal Programming is also discussed to solve the problem multiobjective fractional capacitated TP. Finally, a comparative study is done with the results obtained in the paper and the results from Sadia *et al.* [12]. The results are summarized in Table 5.

This paper proposes fuzzy programming models by applying different membership functions to solve multiobjective fractional capacitated TP. Table 5 also compares the results obtained through different procedures to obtain and compare their efficiency. The methods used in the paper can also be applied for transportation, assignment and transshipment problems.

Table 5: Compromise optimum solution

	Approach	Membership/ Methods	Objective Values		
			Cost	Damage Charges	Time
Sadia et al. [12]	Fuzzy Programming	Linear	1.359296	1.238494	1.389058
		Exponential	1.349030	1.229213	1.314935
		Hyperbolic	1.359296	1.238494	1.389058
	Goal Programming	Lexicographic, d_i distance	1.353103	1.129854	1.237344
Discussed method	Fuzzy Programming	Quadratic	1.349869	1.097561	1.257840
		Fuzzy Normal	1.371758	1.249359	1.264085
		Fuzzy Cauchy	1.359296	1.238494	1.389058
	Goal Programming	Chebyshev's	1.349869	1.097561	1.257840

References

- [1] Akkapeddi, S. M. (2015). Fuzzy programming with quadratic membership functions for multi-objective transportation problem. *Pakistan Journal of Statistics and Operation Research*, 231-240. <https://doi.org/10.18187/pjsor.v11i2.966>
- [2] Arora, S. R., & Gupta, K. (2012). An algorithm for solving a capacitated fixed charge bi-criterion indefinite quadratic transportation problem with restricted flow. *International Journal Of Research In IT, Management and Engineering (ISSN 2249-1619)*, 1(5), 123-140.
- [3] Bit, A. K., Biswal, M. P., & Alam, S. S. (1992). Fuzzy programming approach to multicriteria decision making transportation problem. *Fuzzy sets and systems*, 50(2), 135-141. [https://doi.org/10.1016/0165-0114\(92\)90212-M](https://doi.org/10.1016/0165-0114(92)90212-M)
- [4] Abd El-Wahed, W. F. (2001). A multi-objective transportation problem under fuzziness. *Fuzzy sets and systems*, 117(1), 27-33. [https://doi.org/10.1016/S0165-0114\(98\)00155-9](https://doi.org/10.1016/S0165-0114(98)00155-9)
- [5] Gupta, A., Khanna, S., & Puri, M. C. (1993). A paradox in linear fractional transportation problems with mixed constraints. *Optimization*, 27(4), 375-387. <https://doi.org/10.1080/02331939308843896>
- [6] Gupta, K., & Arora, R. (2019). Optimum cost-time trade-off pairs in a fractional plus fractional capacitated transportation problem with restricted flow. *Investigación Operacional*, 40(1), 46-60.
- [7] Gupta, K., & Arora, S. R. (2012). Paradox in a fractional capacitated transportation problem. *International journal of research in IT, management and engineering*, 2(3), 43-64.
- [8] Gupta, N., & Bari, A. (2014). Fuzzy multi-objective capacitated transportation problem with mixed constraints. *Journal of Statistics Applications & Probability Letters*, 3(2), 1-9. <http://dx.doi.org/10.12785/jsap/JSAP021314S>
- [9] Hitchcock, F. L. (1941). The distribution of a product from several sources to numerous localities. *Journal of mathematics and physics*, 20(1-4), 224-230. <https://doi.org/10.1002/sapm1941201224>
- [10] Liu, S. T. (2016). Fractional transportation problem with fuzzy parameters. *Soft computing*, 20(9), 3629-3636. <https://doi.org/10.1007/s00500-015-1722-5>
- [11] Mon, D. L., & Cheng, C. H. (1994). Fuzzy system reliability analysis for components with different membership functions. *Fuzzy sets and systems*, 64(2), 145-157.
- [12] Sadia, S., Gupta, N., & Ali, Q. M. (2016). Multi-objective capacitated fractional transportation problem with mixed constraints. *Mathematical Sciences Letters*, 5(3), 235-242.
- [13] Singh, P. (2015). Multiple-objective fractional costs transportation problem with bottleneck time and impurities. *Journal of Information and Optimization Sciences*, 36(5), 421-449.
- [14] Swarup, K. (1966). Transportation technique in linear fractional functional programming. *Journal of royal naval scientific service*, 21(5), 256-260.
- [15] Zadeh, L. A. (1965). Fuzzy sets. *Information and control*, 8(3), 338-353.

- [16] Zimmermann, H. J. (1978). Fuzzy programming and linear programming with several objective functions. *Fuzzy sets and systems*, 1(1), 45-55.
- [17] Gupta, S., Haq, A., and Ali, I.(2019) Two-stage transportation in different types of fuzzy environment: an industrial case study. *International Journal of Mathematics and computation*, 30(3), 94-118.
- [18] Kamal, M., Alarjani, A., Haq, A., Yusufi, F. N. K., & Ali, I. (2021). Multi-objective transportation problem under type-2 trapezoidal fuzzy numbers with parameters estimation and goodness of fit. *Transport*, 36(4), 317-338. <https://doi.org/10.3846/transport.2021.15649>