



Delft University of Technology

Critical success factors for a circular economy Implications for business strategy and the environment

Moktadir, Md Abdul; Kumar, Anil; Ali, Syed Mithun; Paul, Sanjoy Kumar; Sultana, Razia; Rezaei, Jafar

DOI

[10.1002/bse.2600](https://doi.org/10.1002/bse.2600)

Publication date

2020

Document Version

Final published version

Published in

Business Strategy and the Environment

Citation (APA)

Moktadir, M. A., Kumar, A., Ali, S. M., Paul, S. K., Sultana, R., & Rezaei, J. (2020). Critical success factors for a circular economy: Implications for business strategy and the environment. *Business Strategy and the Environment*, 29(8), 3611-3635. <https://doi.org/10.1002/bse.2600>

Important note

To cite this publication, please use the final published version (if applicable).
Please check the document version above.

Copyright

Other than for strictly personal use, it is not permitted to download, forward or distribute the text or part of it, without the consent of the author(s) and/or copyright holder(s), unless the work is under an open content license such as Creative Commons.

Takedown policy

Please contact us and provide details if you believe this document breaches copyrights.
We will remove access to the work immediately and investigate your claim.

Green Open Access added to TU Delft Institutional Repository

'You share, we take care!' – Taverne project

<https://www.openaccess.nl/en/you-share-we-take-care>

Otherwise as indicated in the copyright section: the publisher is the copyright holder of this work and the author uses the Dutch legislation to make this work public.

RESEARCH ARTICLE

Critical success factors for a circular economy: Implications for business strategy and the environment

Md. Abdul Moktadir¹  | Anil Kumar²  | Syed Mithun Ali³ |
Sanjoy Kumar Paul⁴  | Razia Sultana¹ | Jafar Rezaei⁵

¹Institute of Leather Engineering and Technology, University of Dhaka, Dhaka, 1209, Bangladesh

²Guildhall School of Business and Law, London Metropolitan University, London, UK

³Department of Industrial and Production Engineering, Bangladesh University of Engineering and Technology, Dhaka, Bangladesh

⁴UTS Business School, University of Technology Sydney, Sydney, New South Wales, Australia

⁵Faculty of Technology, Policy and Management, Delft University of Technology, Delft, The Netherlands

Correspondence

Dr. Sanjoy Kumar Paul, UTS Business School, University of Technology Sydney, Sydney, New South Wales, Australia.
Email: sanjoy.paul@uts.edu.au

Abstract

Eco-efficiency and resource optimization for business strategy and the environment can be achieved by the circular economy (CE) practices in supply chains (SCs). The leather industry is a significant industrial contributor to the economic growth of some countries, but at the same time, it leads to tremendous environmental pollution. This research focuses on the identification and evaluation of critical success factors (CSFs) needed in the business strategy development of CE practices as well as to minimize environmental pollution in leather industry SCs. The CSFs are identified via a comprehensive literature review and are validated by experts' opinions. The validated CSFs are further analyzed using the best-worst method (BWM) and the decision-making trial and evaluation laboratory (DEMATEL). The BWM is used to identify the weights of the CSFs, and DEMATEL is used to determine the cause-effect relationship between the CSFs. The findings show that "leadership and top management commitment" is the most important CSF. Six CSFs are classified as causal towards CE practices: "leadership and top management commitment," "strong legislation towards CE practices," "ecological scarcity of resources," "knowledge of CE practices," "funding support for R&D from the government," and "competitor pressure on CE practices." The findings of this study can help managers in the leather industry implement CE practices in their existing SCs to minimize waste.

KEYWORDS

business strategy, BWM, circular economy, critical success factors, DEMATEL, environmental protection, leather industry, resource optimization

1 | INTRODUCTION

Manufacturing industries play a noteworthy role in the industrial development of a country. To ensure sustainable industrial development, it is important to understand the interdependencies between industry and the environment, economy, and society (Rajesh and Rajendran, 2020; Rajesh, 2020; van Loon and van Wassenhove, 2018; Zhu, 2016). Of these three major areas of impact (environmental, social, and economic), environmental issues have recently received more attention by practitioners and

researchers (Acquaye et al., 2018; Caniato, Caridi, Crippa, & Morretto, 2012; Ding, Zhao, An, & Tang, 2016; Kalverkamp & Young, 2019; Koberg & Longoni, 2019). New concepts in business strategy development such as circular economy (CE) practices (Geissdoerfer, Savaget, Bocken, & Hultink, 2017; Lozowski, 2018) and industry 4.0 (Ding, 2018; Moktadir et al., 2018) have become increasingly popular in developed countries due to their positive impact on the environment. However, there is little evidence on the implementation of these topics in developing countries. Therefore, this study

aims to study the critical success factors (CSFs) of CE in the context of the leather industry of a developing country, Bangladesh.

The rapid industrial development of manufacturing sectors (Singhal & Singhal, 2019) may impose significant negative impacts on society and the environment via the generation of vast amounts of solid waste and harmful air, water, and soil pollution (Govindan & Hasanagic, 2018; Kluczek, 2019). Additionally, population growth increases the consumption of resources. Hence, the challenge is meeting the growing daily demands of the world's population with limited natural resources. To satisfy this demand in the context of scarce natural resources, it is essential to use natural resources more sustainably (Kelle, Song, Jin, Schneider, & Claypool, 2019; Tuni & Rentizelas, 2018). CE practices are one approach to achieving this global agenda (Prieto-Sandoval, Ormazabal, Jaca, & Viles, 2018). CE practices may drive industries to develop strategies for sustainable manufacturing practices (van Loon et al., 2018; Kwon & Lee, 2019; Centobelli, Cerchione, Chiaroni, Del Vecchio, & Urbinati, 2020). They can help minimize waste and build a resilient supply chain (SC) framework. To overcome the issue of scarce natural resources, CE practices such as the 4R policy (reduce, reuse, recycle, remanufacture) may prompt industries to reuse items, recycle waste, and reduce consumption of resources (Govindan & Hasanagic, 2018; van Loon and Van Wassenhove, 2018; Hazen, Mollenkopf, & Wang, 2017). The closed-loop supply chain (CLSC) concept may also contribute to the prevention of environmental pollution (Perey, Benn, Agarwal, & Edwards, 2018). In a CLSC, materials progress through multiple phases, and CE practices in a CLSC have significant benefits. Besides, the economic aspect of CE practices aims to minimize environmental degradation and energy consumption without hampering economic growth or social and technical progress (Marconi, Germani, Mandolini, & Favi, 2019). In developed countries, CE practices have been identified as beneficial for business. It is expected that CE practices in Europe may promote business opportunities, increase job opportunities, and minimize waste and material consumption. In the EU, particularly, CE practices are predicted to generate €600 billion in net savings. In the United Kingdom, CE practices could help create 50,000 new jobs and €12 billion in investment (EMF, 2013). In the Netherlands, CE practices are expected to provide opportunities via the generation of €7.5 billion in market value and the creation of 54,000 new jobs, as well as facilitating environmental benefits (EMF, 2013).

Numerous studies have investigated the implementation and measurement of CEs. Principato, Ruini, Guidi, and Secondi (2019) studied CE practices to minimize food loss and wastage in the context of the Italian pasta industry, while Baldassarre et al. (2019) investigated CE practices for an eco-industrial design process in the south of the Netherlands. In another study, Millar, McLaughlin, and Börger (2019) conducted a literature review to identify and discuss the challenges and opportunities of CEs, and Pieroni, McAloone, and Pigosso (2019) proposed a new business model by conducting a review for the adoption of CE practices. Suárez-Eiroa, Fernández, Méndez-Martínez, and Soto-Oñate (2019) conducted a review to link theory with practice to advance the understanding of CE operational principles, whereas García-Barragán, Eyckmans, and Rousseau (2019) proposed a

mathematical model for measuring CE performance. In a similar study, Ünal and Shao (2019) detailed CE practices for manufacturing firms, whereas Tunn, Bocken, van den Hende, and Schoormans (2019) studied business models for sustainable consumption in the context of CEs. Flynn and Hacking (2019) researched the issue of setting standards for CE practices. Huysveld, Hubo, Ragaert, and Dewulf (2019) developed a performance indicator to measure CE outcomes in the context of the plastic industry in Belgium, and Govindan and Hasanagic (2018) conducted a literature review to identify the drivers, barriers, and practices relevant to a CE.

The literature review reveals that CE could bring several benefits to economies. Previous studies have been mainly conducted in developed countries and in different industries. Little evidence exists to support the benefits of CE in developing countries, and there is no study in the leather industry, a gap that we try to fill in this study. Despite numerous benefits of CE, leather industry of Bangladesh faces challenges like a lack of proper functioning central effluent treatment plant, difficulty in accessing the latest technologies, insufficient legislation towards CE practices, high cost of environmentally friendly chemicals, lack of reverse logistics facilities, and absent of eco-design facilities for waste management, which all are prerequisites for the implementation of CE practices in order to prevent environmental degradation (Hong, 2018; Moktadir et al., 2019; Moktadir et al., 2020). The leather industry of Bangladesh provides clear examples of these challenges as it moves towards adopting CE practices and strategies because of global pressure and environmental pollution. The leather industry is currently a linear economy, and the production process generates substantial water pollution (Moktadir, Ali, Kusi-Sarpong, & Shaikh, 2018). The industry needs to rethink its strategy and adopt global trends. A CE approach can help reduce waste while increasing market value and reputation. However, the execution of CE practices to minimize leather industry waste comes with a series of challenges. To overcome these challenges, it is of utmost importance to identify and examine the CSFs that can lead the leather industry to implement CE practices. Considering gaps in the existing literature, the research objectives are listed as follows.

- a. To identify the key CSFs required to promote CE practices in leather SCs.
- b. To examine the key CSFs by estimating their importance (weights) and determining the contextual relationships between them.
- c. To propose strategic policy frameworks for CE practices in leather SCs, based on the research findings.

In order to fulfill these research objectives, this study reviews the literature to identify the CSFs required to derive CEs. Then, the best-worst method (BWM) is employed to determine the importance (weight) of each CSF. Finally, the decision-making trial and evaluation laboratory (DEMATEL) method will be used to determine the cause-effect relationships between CSFs. The contribution of this research is twofold. First, it is the first attempt to identify a comprehensive list of CSFs required to derive CE practices in the industrial domain of the leather industry, one of the most environmentally detrimental

industrial segments. Second, a combined approach of BWM and DEMATEL is used in this study to provide a clear understanding to industry managers and policy makers about the relative importance (weight) and cause–effect relationships of CSFs.

The remainder of the paper is structured in the following sequence. Section 2 provides a review of existing literature to identify the CSFs and validates them using experts' opinions.

Section 3 provides details of the research framework and methods of the study. Section 4 presents the analysis and results of the study, which is followed by a discussion of the findings in Section 5. Section 6 gives an overview of the theoretical and policy implications of the research, and Section 7 concludes the paper with a discussion of the limitations of this research and future research goals.

TABLE 1 Contribution of the previous literature on CE

Reference	Contribution	Country context	Industry context	Methodology
Primc, Kalar, Slabe-Erker, Dominko, and Ogorevc (2020)	In this study, the authors contributed to the organizational life cycle theory by proposing configuration indicators of CE. They proposed 13 indicators of the organizational life cycle.	Slovenian	Manufacturing, retail, and industrial sectors	Crisp-set qualitative comparative analysis
de Sadeleer, Brattebø, and Callewaert (2020)	They investigated the environmental benefits for household organic food waste towards CE practices.	Norway	Household organic food waste	Material flow analysis and life cycle analysis (LCA)
Suzanne, Absi, and Borodin (2020)	In their study, the authors conducted a systematic literature review to offer research towards CE in production planning.	-	-	Literature review
Luttenberger (2020)	Author demonstrated the waste and circularity indicators to ensure circularity in waste management.	Croatia	Waste food and plastics	Holistic approach
Sassanelli, Rosa, Rocca, and Terzi (2019)	In their literature review, the authors focused on the performance assessment of circularity in the companies.	-	-	Systematic literature review
Genovese, Acquaye, Figueroa, and Koh (2017)	In that study, the authors investigated the environmental performance of two process industries in the context of traditional and circular production systems.	EU	Chemical and food	Hybrid LCA
Sousa-Zomer, Magalhães, Zancul, and Cauchick-Miguel (2018)	They demonstrated the challenges to circular business models for manufacturing firms.	Brazil	Manufacturing firms	Qualitative case study design
Heyes, Sharmina, Mendoza, Gallego-Schmid, and Azapagic (2018)	In their study, the authors demonstrated the service-oriented business sector to develop and offer CE business model.	The UK	Micro-ICT business	Iterative Backcasting and Eco-design for Circular Economy (BECE) decision-support framework
Bressanelli, Adrodegari, Perona, and Saccani (2018)	They offered the conceptual framework to show how digital technologies can enable CE practices within a usage-focused servitized business model.	Northern Europe	Household appliance industry	Conceptual framework
Kirchherr et al. (2018)	They investigated barriers to CE in the context of the European Union (EU).	EU	-	Survey-based research

2 | LITERATURE REVIEW

This section highlights existing literature regarding CE and waste management, waste management in leather SCs, and CSFs for CE implementation.

2.1 | CE and waste management

The CE is the process of transforming SC operations from the linear model to a circular production/business model, where used/waste materials and components are reintroduced into the SC in a closed-loop system through reusing, recycling, remanufacturing, repair, and refurbishing as a means of recapturing value and minimizing negative impacts (Chen, Lu, Ming, Zhang, & Zhou, 2020; Frei, Jack, & Krzyzaniak, 2020; Kusi-Sarpong et al., 2019). With the implementation of CE practices, waste generation from manufacturing can be reduced by a significant amount (Katz-Gerro & López Sintas, 2018). In a CE, waste materials are assessed for further use (Abbey, Geismar, & Souza, 2019; Murray, Skene, & Haynes, 2017). If reuse is not possible, the materials are passed on for recycling, which helps manage waste significantly. CE practices for waste management have attracted the attention of many researchers and practitioners in developed countries (Korhonen, Honkasalo, & Seppälä, 2018; Sariatli, 2017), and research into CE practices in waste management has recently gained popularity. Mahpour (2018) identified the barriers to CEs for construction and demolition waste, whereas Qu et al. (2019) investigated the effects of China's waste ban on the global CE. Blomsma (2018) proposed "collective" action recipes in CE implementation to manage waste and resources, and Malinauskaitė et al. (2017) highlighted solid waste management in the context of a CE. Table 1 summarizes previous studies on CE.

This literature demonstrates that managing waste via waste reduction is currently a popular research topic. However, we found no studies on the implementation of CE practices in waste management in the leather industry, which has its own characteristics and calls for further investigation. This paper is an attempt to fill this research gap.

2.2 | CE in the leather industry

Leather is a valuable commodity with a long history of positive contributions to the economic development of countries (Kweka et al., 2014). The world market for leather, leather goods, and leather footwear is approximately US\$215 billion of which Bangladesh captures only US\$1.08 billion (EPB Report, 2018). To efficiently secure a higher percentage of the world market, this industrial sector needs proper strategic planning for the implementation of CE practices. The size of the world market for leather shows that the leather industry is important for Bangladesh's economic growth; however, it negatively impacts the environment by generating various liquid and solid waste products during the manufacturing process. The negative impact of those waste products needs careful consideration and application of

waste minimization and environmental pollution reduction strategies (Nadeem, Garza-Reyes, & Glanville, 2018). The waste generated throughout the life cycle of leather and leather goods is alarming. Various types of waste, including leather, plastic, solid waste, tannery effluent, and chemicals, are generated during the manufacturing process (Pringle, 2017). Current disposal procedures for leather materials and tannery effluent do not optimize the recovery of waste leather and effluents (Moktadir, Ali, Rajesh, & Paul, 2018). Furthermore, the manufacturing process for various types of leather goods is a major area of solid waste generation. Currently, leather, leather goods, and leather footwear industries operate a linear manufacturing system. To satisfy future demand and achieve efficient manufacturing that minimizes waste, it is essential to implement a closed-loop manufacturing framework. A closed-loop manufacturing framework may allow the leather industry to minimize waste as well as optimize the use of raw materials in the manufacturing process. The framework for closed-loop leather processing is shown in Figure 1.

2.3 | CSFs for a CE

In this section, the CSFs needed to derive CE practices are discussed briefly. The theory of CSFs is well established in the literature, examining different industries like textiles, mining, oil and gases, and chemicals. The theory of CSFs can be explained as "the areas in which the results if they are satisfactory, will ensure successful competitive performance for the firms" (Dinter, 2013). CSFs may be able to ensure and improve organizational performance (Dewi, Ciptayani, Surjono, & Priyanto, 2018). The identification of CSFs can assist firms in the

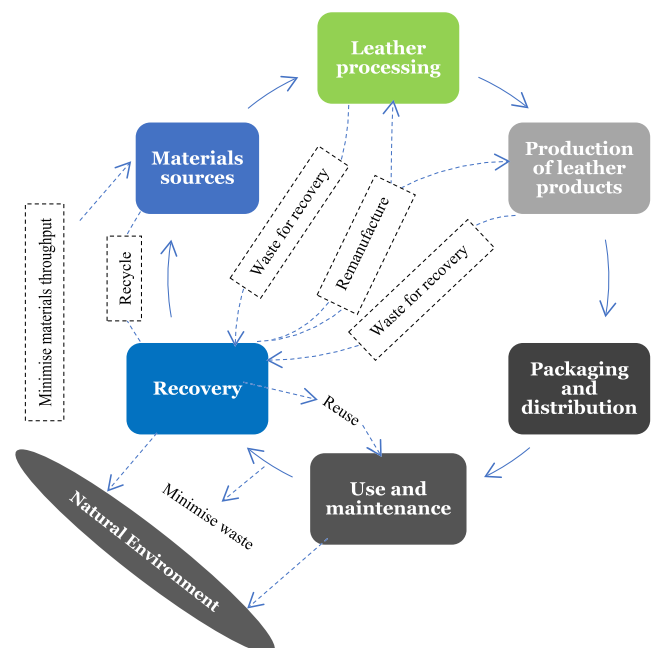


FIGURE 1 Closed-loop manufacturing system [Colour figure can be viewed at wileyonlinelibrary.com]

formulation of strategic policy directed towards achieving organizational goals.

The following steps were employed to identify CSFs:

1. Keywords such as “critical success factors,” drivers/challenges/key factors/enablers of the CE, were utilized to search for scientific articles on various scholarly databases.
2. ScienceDirect, Scopus, Wiley, Google Scholar, Emerald, Springer, and Taylor & Francis were used to gather relevant papers. All collected articles were refined as per the set attributes: Articles must be written in English, peer-reviewed, and suitable for the current research theme.
3. From the identified articles, the CSFs were finalized via brainstorming sessions with experts from the leather industry. These

sessions not only helped to remove overlapping CSFs but also helped develop new criteria relevant to leather industry SCs like “appropriate facilities for waste recycling and reuse” and “capacity-building and information management for CEs.”

Using the above-mentioned steps, CSFs identified from the literature review are listed and briefly explained in Table 2.

3 | RESEARCH FRAMEWORK AND METHODS

The research methodology framework of the study is outlined in Figure 2.

TABLE 2 CSFs identified from the literature review

Critical success factor (CSF)	Brief description	References
Eco-design for waste management	Eco-design can help minimize environmental pollution. It also helps to achieve resource efficiency by minimizing waste in SCs.	Bilitewski (2007); Senthil Kumar and Femina Carolin (2018)
Funding support for R&D from the government	R&D for CE implementation needs funding. It requires the decision makers to make SCs more efficient for CE implementation.	Rizos et al. (2016); Sousa-Zomer et al. (2018)
Leadership and top management commitment	Leadership and top management commitment may cause decision makers to implement CE practices. CE implementation requires good leadership and commitment from top management.	Heyes et al. (2018); Zucchella and Previtali (2018)
Ecological scarcity of resources	Ecological scarcity of resources may act as a success factor by forcing decision makers to implement CE practices to minimize resource usage in the production process. It may act as a motivational success factor for CE implementation.	Bressanelli et al. (2018); Murray, Skene, and Haynes (2015); Senthil Kumar and Femina Carolin (2018)
Strong legislation mandating CE	Strong legislation can force industries to implement CE practices for the reduction of environmental pollution. It may stimulate the collection of used products and waste for recycling and reuse.	Ali et al. (2018); Moktadir, Rahman, Rahman, Ali, and Paul (2017)
Knowledge of CE	In developing countries like Bangladesh, CE practices are not well-known. Training facilities for CE practices could be helpful for CE implementation.	Moktadir et al. (2017)
Reverse logistics practices	Used products create significant environmental pollution. Reverse logistics practices throughout the SC may help to achieve CE goals.	Lu and Ye (2007); Yunkai (2009); Zeqiang and Wenming (2006)
Competitor pressure towards CE	Increasing globalization compels the leather industry to represent themselves not only within the domestic market but also within the international market. Competitor pressure towards CE practices in the global market can compel the introduction of CE practices.	Kirchherr et al. (2018); Kirchherr et al. (2017)

Abbreviation: CE, circular economy.

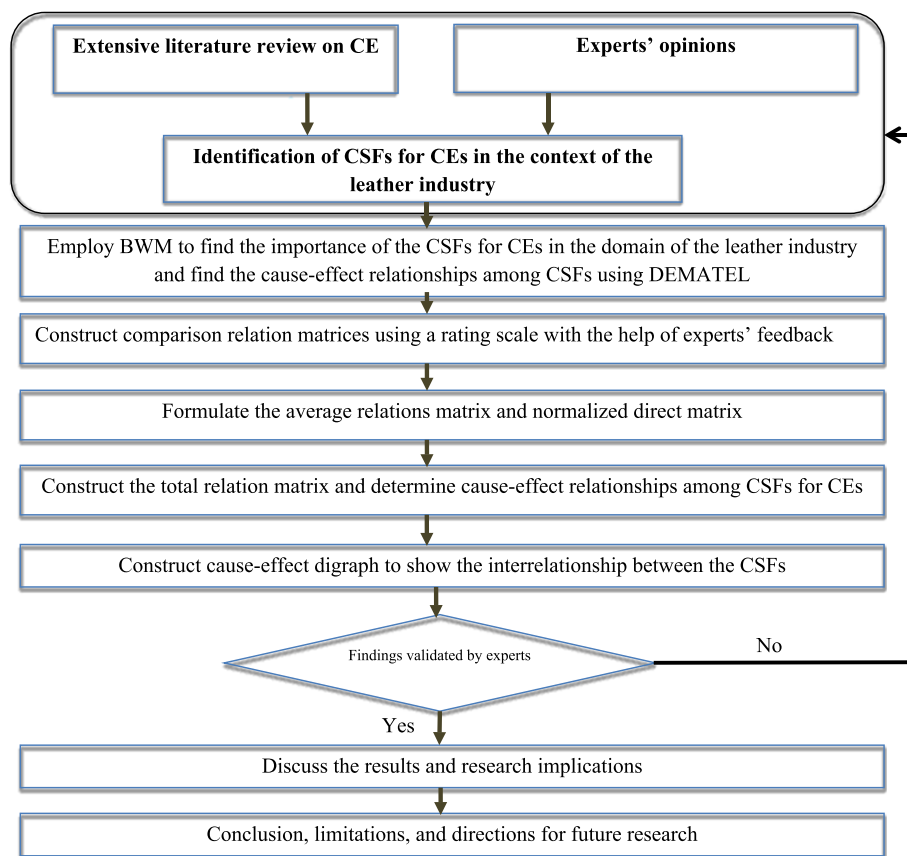


FIGURE 2 Research methodology framework of the study [Colour figure can be viewed at wileyonlinelibrary.com]

As it can be seen from Figure 2, the core methods we are using in this study are BWM and DEMATEL, two popular multiple-criteria decision-making (MCDM) methods (Chowdhury & Paul, 2020) with various applications in solving complex real-world problems (see Table 3 for some applications). In the following two subsections, we explain these two methods.

From the literature review and the application areas of BWM and DEMATEL presented in Table 3, it is clear that the research gaps exist in the literature on the combination of BWM and DEMATEL in the CE context. Additionally, we used a combined approach of BWM-DEMATEL because not only we want to find the importance of the CSFs (which is identified by BWM), but we also want to see the relationship between the CSFs (which are identified by DEMATEL). The individual methods we employ (BWM and DEMATEL) have several advantages, which make them suitable for our study. We use BWM because (i) the structured pairwise comparison used in BWM (i.e., using two reference points and conducting the pairwise comparisons based on these reference points) leads to more reliable and consistent pairwise comparisons by the experts; (ii) the use of two opposite reference points in BWM could mitigate possible anchoring bias in pairwise comparisons provided by the experts; (iii) compared with matrix-based methods (e.g., AHP), BWM is a data-efficient method that not only uses less pairwise comparisons, but it also enables the analysts to check the consistency of the provided pairwise comparisons (something that is not possible for single-vector methods

like Swing) (Rezaei, 2020). We use DEMATEL as it is the only known reliable method in the context of the MCDM field to identify the cause-effect relationship among the criteria. The cause-effect relationship will help decision makers formulate strategies towards waste minimization via the implementation of CE practices.

The following two subsections describe the methodological procedure of BWM-DEMATEL.

3.1 | Best-worst method

The BWM procedure is described below (Rezaei, 2015, 2016).

Step 1: Identification of decision criteria by the decision makers/experts.

A set of n decision criteria (here, the CSFs) is fixed as $\{c_1, c_2, \dots, c_n\}$.

Step 2: Decision makers/experts determine the best and worst criteria found in Step 1.

In this stage, decision makers/experts identify the best and worst criteria. The best here represents the most important CSF, whereas the worst represents the least important CSF.

Step 3: Decision makers/experts compare the best criterion to the other criteria.

A decision maker/expert constructs the best-to-others vector using a 1–9 scale, where 1 indicates an equal preference between the

TABLE 3 Major and recent application areas of BWM and DEMATEL

Author(s)	Application areas	Methodology
Wang et al. (2020)	In this study, the authors offered an integrated framework based on BWM to assess the risks of chemical plants for implementing strategies for environmental risk mitigation.	• BWM
Yadav, Luthra, Jakhar, Mangla, and Rai (2020)	In this study, the authors developed a framework based on the BWM and ELimination Et Choix Traduisant la REalité (ELECTRE) approach to investigate the challenges and solution measures for the implementation of industry 4.0 and circular economy.	• BWM • ELECTRE
Moktadir et al. (2020)	The authors investigated the challenges faced by the leather industry towards CE practices.	• BWM
Singh and Sarkar (2020)	They investigated the eco-design practices for sustainable product development.	• Delphi and DEMATEL
Munim, Sornn-Friese, and Dushenko (2020)	They demonstrated the port governance models for the successful implementation of green port management practices in the port of Bangladesh, Sri Lanka, and Tanzania.	• ANP • BWM
Kusi-Sarpong et al. (2019)	They examined sustainable suppliers in the context of a circular economy.	• BWM • VIKOR
Rajput and Singh (2019)	In this study, the authors demonstrated the connecting factors (i.e., enabling and challenging factors) of industry 4.0 and circular economy.	• PCA • DEMATEL
Paul, Moktadir, and Paul (2019)	They evaluated the transportation service provider based on sustainability criteria.	• BWM • VlseKriterijumska Optimizacija I Kompromisno Resenje (VIKOR)
Kheybari, Kazemi, and Rezaei (2019)	In their study, the authors examined the factors related to bioethanol facility location selection.	• BWM
Raj and Sah (2019)	In their study, the authors investigated CSFs towards drone implementation in the logistics sector.	• DEMATEL
Moktadir, Ali, Kusi-Sarpong et al. (2018)	Authors assessed the challenges surrounding industry 4.0 implementation in the leather industry.	• BWM
Moktadir, Ali, Rajesh et al. (2018)	In this study, authors developed a decision support framework to assess the interrelationship between barriers to sustainable supply chain implementation.	• DEMATEL
Ahmadi, Kusi-Sarpong, and Rezaei (2017)	In this research, authors assessed the social sustainability criteria for the sustainable supply chain management.	• BWM

Abbreviations: ANP, analytic network process; BWM, best–worst method; CE, circular economy; DEMATEL, decision-making trial and evaluation laboratory; PCA, principal component analysis.

criteria and 9 indicates an extreme preference. The constructed best-to-others vector is written as follows:

$$A_B = (a_{B1}, a_{B2}, \dots, a_{Bn}), \quad (1)$$

where a_{Bj} denotes the preference value of Best criterion B over criterion j .

Step 4: Decision makers/experts compare the other criteria to the worst.

A decision maker constructs the others-to-worst vector using a 1–9 scale, where 1 indicates an equal preference between the criteria and 9 indicates an extreme preference. The constructed others-to-worst vector is written as follows:

$$A_W = (a_{1W}, a_{2W}, \dots, a_{nW}), \quad (2)$$

where a_{jW} denotes that the preference value of criterion j over the worst criterion W .

Step 5: Compute the optimal weight of the decision criteria $(w_1^*, w_2^*, \dots, w_n^*)$.

Compute the optimal weights of the decision criteria (here, the CSFs), so the maximum absolute differences for all j are minimized over the following set:

$$\{|w_B - a_{Bj}w_j|, |w_j - a_{jW}w_W|\}.$$

A min-max model can be constructed as follows:

$$\min \max_j \{|w_B - a_{Bj}w_j|, |w_j - a_{jW}w_W|\},$$

subject to,

$$\sum_j w_j = 1,$$

$$w_j \geq 0 \text{ for all } j. \quad (3)$$

Model 3 may be transformed into a linear programming problem as follows:

$$\min \xi^L,$$

subject to,

$$|w_B - a_{Bj}w_j| \leq \xi^L \text{ for all } j,$$

$$|w_j - a_{jW}w_W| \leq \xi^L \text{ for all } j,$$

$$\sum_j w_j = 1,$$

$$w_j \geq 0 \text{ for all } j. \quad (4)$$

By solving model 4, the optimal weights of all the criteria $(w_1^*, w_2^*, \dots, w_n^*)$ and the optimal value of ξ^L are achieved. A lower ξ^L value denotes higher consistency and vice versa.

3.2 | DEMATEL

DEMATEL (Gabus & Fontela, 1972) is a powerful decision-making tool that is used in MCDM practical problems. It has the unique characteristic of being able to capture the interrelationship between criteria and show this relationship in a digraph. It helps to compute the cause-effect relationship between factors, where causal criteria have the power to derive improvement in the effect criteria. In addition, this means the improvement of a causal variable can reciprocally

improve the effect variable. The procedure of the DEMATEL technique is described below.

Step 1: Experts' feedback is taken to construct the initial relation matrices between previously identified CSFs of CE practices, using a linguistic rating scale. In this research, the linguistic rating scale in Table 4 was provided to experts for them to construct the initial relation matrices.

If the number of identified CSFs for CE practices is n and the number of respondents is H , $k = 1, \dots, H$, it follows that each expert construct a $(n \times n)$ matrix indicated as $X^k = [x_{ij}^k]$, where x_{ij}^k indicates the significant value of factor i affects factor j according to expert k .

For the H number of experts, the initial relation matrices were constructed as follows:

$$X^1 = [x_{ij}^1], X^2 = [x_{ij}^2], \dots, X^H = [x_{ij}^H]. \quad (5)$$

Therefore, the average initial relation matrix $M = [\bar{x}_{ij}]$ is constructed by averaging initial relation matrices obtained from H experts. The average relation matrix is constructed using the following equation:

$$\bar{x}_{ij} = \frac{1}{H} \sum_{k=1}^H x_{ij}^k. \quad (6)$$

Step 2: In this step, the normalized direct-relation matrix P is constructed. The normalized direct-relation matrix is formulated from the average relation matrix M with the help of the following equation:

$$P = M \times S, \quad (7)$$

where S is computed in the following way:

$$S = \min \left[\frac{1}{\sum_{j=1}^n |\bar{x}_{ij}|}, \frac{1}{\sum_{i=1}^n |\bar{x}_{ij}|} \right].$$

Step 3: In this step, a total relation matrix T is constructed using Equation 8.

$$T = P[I - P]^{-1}, \quad (8)$$

where the notation I indicates the identity matrix.

TABLE 4 Linguistic rating scale for DEMATEL analysis

Linguistic scale	Linguistic attributes
0	Totally no influence
2	Very low influence
4	Low influence
6	Medium influence
8	High influence
10	Extremely highly influence

Note: Intermediate scores 1, 3, 5, 7, and 9 can be used if necessary.

Step 4: This step involves developing cause and effect variables by summing rows and columns.

From the total relation matrix, $T = [t_{ij}]_{n \times n}$, the r_i and c_j values are determined. r_i denotes the sum of the i th row in matrix T , and c_j denotes the sum of j th column in matrix T . Therefore, r_i and c_j can be computed by the following equations.

$$r_i = \sum_{j=1}^n t_{ij}, \forall i, \quad (9)$$

$$c_j = \sum_{i=1}^n t_{ij}, \forall j. \quad (10)$$

The sum $(r_i + c_j)$ denotes the total effect received by CSF i . In addition, it indicates the “prominence” group CSFs. It also represents the degree of importance for the i th CSF in the whole system. Consequently, the value of $(r_i - c_j)$ indicates the “net effect” that the i th CSF contributes to the whole system. If the value of $(r_i - c_j)$ is positive, the i th CSF is the net cause group. If the value of $(r_i - c_j)$ is negative, the i th CSF indicates the net effect.

Step 5: The threshold value is computed from the total relation matrix to develop a causal digraph. It is computed by summing up the mean value and standard deviation of CSFs in the total relation matrix T , in order to help to avoid complexity in the digraph. Therefore, causal relations are plotted in the digraph with the help of dataset $((r_i + c_j), (r_i - c_j)), \forall i = j$.

4 | ANALYSIS AND RESULTS

4.1 | Case study companies

The leather industry is one of the oldest industrial segments in Bangladesh. The contribution of the leather industry to the country's economy is significant due to the availability of raw materials, the high quality of grain patterns of the finished leather, and the cheap labor costs. However, the leather industry is responsible for such a high degree of environmental degradation, with a massive amount of waste generated from tannery operations (Moktadir et al., 2018). In addition, according to a 2018 Environmental Performance Index (EPI) report, Bangladesh ranks 179th among the 180 countries in the world (EPI Report, 2018), which should improve CE practices, as CE practices are still not well established in the leather industry. To sustain the leather business in the global market and to introduce CE initiatives for the minimization of waste, it is important to identify and examine CSFs for the leather industry. Therefore, in this research, CSFs required to derive CE implementation have been identified via a detailed literature review and feedback from experts at real leather-processing companies. The five real case study companies selected for the data evaluation (Table 5) assessed the CSFs of CE practices. They have a strong interest in developing sustainable business models/frameworks and supporting organizational goals to

minimize waste. The convenience and snowball sampling methods were used for selection. After contacting one expert, that expert referred the research team to another expert working in the same area who had vast experience regarding our research topic. In this study, 15 experts from five case companies responded to participate in data collection. Data were collected from the experts in three stages. In the first stage, we collected feedback from experts by arranging face-to-face interview. In the face-to-face interview of the first stage of data collection, we have provided the identified CSFs to experts for its validation and also asked to suggest new relevant CSFs in the context of the leather industry SC. On the basis of the feedback of experts, apart from the CSFs identified by reviewing existing literature, we received two new CSFs. These CSFs are

- *Appropriate facilities for waste recycling and reuse:* Tannery effluent needs appropriate facilities for recycling to minimize waste generation and to utilize waste for further use.
- *Capacity-building and information management for CE:* Capacity-building and updating information management systems are prerequisites for implementing CE practices.

Details of all 15 experts and the five selected real case study companies involved in this study are provided in Table 5. All experts demonstrated agreement regarding the CSFs and their implications for waste minimization.

4.2 | Application of BWM

In the second stage of data collection, we sent a set of structured questionnaires to 15 experts through email. To evaluate the importance of the CSFs, we asked the experts (Table 5) for their input in determining the best and worst CSFs and conducting pairwise comparisons among best and worst and other CSFs using a 1–9 scale. The best and worst CSFs were identified as the most important and least important CSFs, respectively, for implementing CE via the experts' input, as shown in Table 6.

The ratings for the best CSF over the other CSFs and the other CSFs over the worst CSF for the respondents were constructed using Equations 1 and 2 and are displayed in Tables 7 and 8, respectively. In addition, the weight assigned to each CSF by each expert was obtained via model 4 and is shown in Table 9. After calculating the weights from each respondent, the weights of the CSFs were averaged. The average weights are summarized in Table 9. We also checked the consistency ratio of the pairwise comparisons based on the input-based thresholds in Liang, Brunelli, and Rezaei (2019) and found that all pairwise comparisons are reliable.

The final rankings of CSFs for CE practices are made based on the average weight of each CSFs obtained from the BWM and are presented in Table 10.

TABLE 5 Characteristics of the five real companies and 15 leather industry experts involved in the study

The selected leather companies interested in implementing CE practices	
<u>Company 1</u> <i>Annual production rate:</i> Greater than 31 million square feet of leather <i>Annual sales turnover:</i> US\$40 million	<u>Company 2</u> <i>Annual production rate:</i> Greater than 18 million square feet of leather <i>Annual sales turnover:</i> US\$24 million
<u>Company 3</u> <i>Annual production rate:</i> Greater than 8 million square feet of leather <i>Annual sales turnover:</i> US\$15 million	<u>Company 4</u> <i>Annual production rate:</i> Greater than 7 million square feet of leather <i>Annual sales turnover:</i> US\$12 million
<u>Company 5</u> <i>Annual production rate:</i> Greater than 3 million square feet of leather <i>Annual sales turnover:</i> US\$9 million	
The selected leather company experts	
<u>Manager 1, Company 1:</u> <i>Position:</i> Senior production manager (SPM) <i>Role:</i> Ensuring operations run smoothly by monitoring the overall process, managing research and development, evaluating the market, and maintaining relationships with buyers <i>Years of experience:</i> 17+ years	<u>Manager 2, Company 1:</u> <i>Position:</i> Supply chain manager (SCM) <i>Role:</i> Ensuring supply meets demand, processing shipments, and managing the workers' facilities <i>Years of experience:</i> 16+ years
<u>Manager 3, Company 1:</u> <i>Position:</i> Technical manager (TM) <i>Role:</i> Processing the raw hides and skins, solving technical problems, and ensuring the quality of the finished leather <i>Years of experience:</i> 18+ years	<u>Manager 4, Company 2:</u> <i>Position:</i> Production manager (PM) <i>Role:</i> Managing overall production processes and quality of the finished leather <i>Years of experience:</i> 15+ years
<u>Manager 5, Company 2:</u> <i>Position:</i> Logistics manager (LM) <i>Role:</i> Managing the timely delivery of finished leather, managing the transportation facility and controlling relationships with buyers <i>Years of experience:</i> 11+ years	<u>Manager 6, Company 2:</u> <i>Position:</i> Technical manager (TM) <i>Role:</i> Processing the raw hides and skins, solving technical problems, and ensuring the quality of the finished leather <i>Years of experience:</i> 19+ years
<u>Manager 7, Company 3:</u> <i>Position:</i> Supply chain manager (SCM) <i>Role:</i> Managing sourcing/procurement, meeting timely demands, contracting & warehouse management <i>Years of experience:</i> 16+ years	<u>Manager 8, Company 3:</u> <i>Position:</i> Technical manager (TM) <i>Role:</i> Responsible for processing the raw hides and skins, solving technical problems, and ensuring the quality of the finished leather <i>Years of experience:</i> 15+ years
<u>Manager 9, Company 3:</u> <i>Position:</i> Senior merchandiser (SM) <i>Role:</i> Purchasing chemicals, processing shipments, preparing the production schedule, and maintaining good relationships with foreign buyers <i>Years of experience:</i> 16 + years	<u>Manager 10, Company 4:</u> <i>Position:</i> Senior production manager (SPM) <i>Role:</i> Monitoring the overall process to ensure smooth operations, managing research and development, evaluating the market, and maintaining relationships with buyers <i>Years of experience:</i> 19+ years
<u>Manager 11, Company 4:</u> <i>Position:</i> Technical manager (TM) <i>Role:</i> Responsible for processing the raw hides and skins, solving technical problems, and ensuring the quality of the finished leather <i>Years of experience:</i> 16+ years	<u>Manager 12, Company 4:</u> <i>Position:</i> Senior planning executive (SPE) <i>Role:</i> Preparing the overall production plan, preparing budgetary planning, and executing the total cost involved in operating the factory <i>Years of experience:</i> 15+ years
<u>Manager 13, Company 5:</u> <i>Position:</i> Senior production manager (SPM) <i>Role:</i> Monitoring the overall process to ensure smooth operations, managing research and development, evaluating the market, and maintaining relationships with buyers <i>Years of experience:</i> 15+ years	<u>Manager 14, Company 5:</u> <i>Position:</i> Technical manager (TM) <i>Role:</i> Processing the raw hides and skins, solving technical problems, and ensuring the quality of the finished leather <i>Years of experience:</i> 21+ years
<u>Manager 15, Company 5:</u> <i>Position:</i> Senior chemist (SC) <i>Role:</i> Preparing recipes for the leather processing operations, ordering required chemicals, and checking the quality of the chemicals <i>Years of experience:</i> 15+ years	

Abbreviation: CE, circular economy.

TABLE 6 Selection of best and worst CSFs

Code	Critical success factors (CSFs)	Best CSFs marked by decision maker	Worst CSFs marked by decision maker
CSF ₁	Eco-design for waste management		3M, 5M, 10M, 13M
CSF ₂	Funding support for R&D from the government		8M, 11M, 14M
CSF ₃	Leadership and top management commitment	2M, 4M, 6M, 9M	
CSF ₄	Appropriate facilities for waste recycling and reuse	13M, 14M	
CSF ₅	Ecological scarcity of resources		2M, 6M
CSF ₆	Strong legislation towards CE	1M, 5M, 10M	
CSF ₇	Knowledge of CE		9M, 12M
CSF ₈	Practices of reverse logistics	3M, 8M, 11M, 12M	
CSF ₉	Capacity-building and information management for CE	7M, 15M	
CSF ₁₀	Competitor pressure towards CE		1M, 4M, 7M, 15M

Note. M stands for an industry manager.
Abbreviation: CE, circular economy.

4.3 | Application of DEMATEL

The DEMATEL method was used to assess the interactions between CSFs. DEMATEL is a very dynamic MCDM method that helps capture the causal relationship between CSFs (Kumar, Mangla, Luthra, & Ishizaka, 2018). In the third stage of data collection, the research team approached the experts (Table 5) via email communication, to get their inputs on the interactions among the finalized CSFs. Nine experts out of 15 responded in this stage and provided the interactions among the CSFs. The comparison relationship matrices were constructed based on experts' feedback using the linguistic rating scale shown in Table 4. The initial relationship matrices for the CSFs are given in Tables A1–A9. The average relationship matrix was constructed using Equation 6, which is shown in Table 11.

The normalized direct relation matrix (**P**) is constructed from the average matrix using Equation 7. The final normalized CSF relation matrix is presented in Table 12.

Following this, the total relation matrix is constructed using Equation 8. The total relation matrix is provided in Table 13.

From the total relation matrix, the values of r_i and c_j are computed using Equations 9 and 10. The sum of $r_i + c_j$ and $r_i - c_j$ was also computed. The value of $r_i - c_j$ indicates the impact of each CSF. If the value of $r_i - c_j$ is positive, the CSFs are considered causal. If the value of $r_i - c_j$ is negative, the CSF is in the effect group. The causal impact of CSFs is displayed in Table 14.

To avoid minor effect, a threshold value is computed using the formula (Mean + Standard deviation = 0.2477 + 0.0794 = 0.327). Those values that are greater than the threshold values are marked

TABLE 7 Evaluation of best-to-other CSFs to CE implementation

Expert	Best CSF	CSFs									
		CSF ₁	CSF ₂	CSF ₃	CSF ₄	CSF ₅	CSF ₆	CSF ₇	CSF ₈	CSF ₉	CSF ₁₀
Company-1: M1	CSF ₆	5	6	3	4	8	1	7	2	4	9
Company-1: M2	CSF ₃	6	5	1	4	9	4	6	3	2	7
Company-1: M3	CSF ₈	9	5	3	6	5	4	6	1	2	7
Company-2: M4	CSF ₃	3	6	1	8	5	4	7	2	4	9
Company-2: M5	CSF ₆	9	6	3	5	2	1	7	4	3	7
Company-2: M6	CSF ₃	5	4	1	3	9	8	7	2	4	6
Company-3: M7	CSF ₉	4	6	2	8	5	4	7	3	1	9
Company-3: M8	CSF ₈	5	9	3	4	8	7	6	1	2	6
Company-3: M9	CSF ₃	4	7	1	6	3	8	9	5	2	7
Company-4: M10	CSF ₆	9	8	3	7	5	1	6	3	2	8
Company-4: M11	CSF ₈	5	9	3	7	6	4	2	1	2	7
Company-4: M12	CSF ₈	6	7	3	5	4	8	9	1	2	8
Company-5: M13	CSF ₄	9	7	2	1	5	3	7	4	5	8
Company-5: M14	CSF ₄	5	9	2	1	5	8	6	4	3	7
Company-5: M15	CSF ₉	2	4	2	6	7	4	5	3	1	9

Abbreviation: CSF, critical success factor.

TABLE 8 Experts' comparison—Others-to-worst CSFs to CE implementation

Others to the worst	Experts									
	Company-1: M1	Company-1: M2	Company-1: M3	Company-2: M4	Company-2: M5	Company-2: M6	Company-3: M7	Company-3: M8		
	CSF ₁₀	CSF ₅	CSF ₁	CSF ₁₀	CSF ₁	CSF ₅	CSF ₁₀	CSF ₂		
CSF ₁	6	3	1	3	1	2	6	2		
CSF ₂	3	6	4	8	3	4	3	1		
CSF ₃	2	9	7	9	2	9	6	7		
CSF ₄	5	6	2	2	5	5	8	3		
CSF ₅	4	1	3	4	8	1	2	5		
CSF ₆	9	3	4	6	9	5	5	4		
CSF ₇	6	4	2	5	2	6	4	6		
CSF ₈	8	7	9	7	5	8	7	9		
CSF ₉	7	8	6	7	8	7	9	7		
CSF ₁₀	1	2	3	1	6	2	1	3		

Abbreviations: CE, circular economy; CSF, critical success factor.

TABLE 8 Continued

Others to the worst	Experts									
	Company-3: M9	Company-4: M10	Company-4: M11	Company-4: M12	Company-5: M13	Company-5: M14	Company-5: M15			
	CSF ₇	CSF ₁	CSF ₂	CSF ₇	CSF ₁	CSF ₂	CSF ₁₀			
CSF ₁	5	1	2	2	1	5	2			
CSF ₂	8	2	1	5	2	1	6			
CSF ₃	9	7	7	7	5	8	7			
CSF ₄	6	5	5	4	9	9	5			
CSF ₅	3	7	8	6	7	3	3			
CSF ₆	4	9	7	3	5	8	6			
CSF ₇	1	4	4	1	6	7	4			
CSF ₈	5	8	9	9	3	6	7			
CSF ₉	8	6	6	8	4	7	9			
CSF ₁₀	2	3	3	3	3	3	1			

Abbreviations: CE, circular economy; CSF, critical success factor.

TABLE 9 Final weights of the CSFs

Expert	ξ^{L*}	Weights									
		CSF ₁	CSF ₂	CSF ₃	CSF ₄	CSF ₅	CSF ₆	CSF ₇	CSF ₈	CSF ₉	CSF ₁₀
Company-1: M1	0.0800	0.0713	0.0594	0.1189	0.0891	0.0446	0.2765	0.0509	0.1783	0.0891	0.0218
Company-1: M2	0.0695	0.0579	0.0695	0.2781	0.0869	0.0232	0.0869	0.0579	0.1159	0.1738	0.0497
Company-1: M3	0.0608	0.0254	0.0700	0.1166	0.0583	0.0700	0.0875	0.0583	0.2890	0.1749	0.0500
Company-2: M4	0.0942	0.1207	0.0604	0.2680	0.0453	0.0724	0.0905	0.0517	0.1811	0.0905	0.0193
Company-2: M5	0.0773	0.0211	0.0574	0.1147	0.0688	0.1721	0.2669	0.0492	0.0860	0.1147	0.0492
Company-2: M6	0.0800	0.0713	0.0891	0.2765	0.1189	0.0218	0.0446	0.0509	0.1783	0.0891	0.0594
Company-3: M7	0.1003	0.0911	0.0608	0.1823	0.0456	0.0729	0.0911	0.0521	0.1215	0.2643	0.0182
Company-3: M8	0.0784	0.0732	0.0232	0.1219	0.0915	0.0457	0.0523	0.0610	0.2874	0.1829	0.0610
Company-3: M9	0.1016	0.0946	0.0540	0.2767	0.0630	0.1261	0.0473	0.0195	0.0757	0.1891	0.0540
Company-4: M10	0.0819	0.0220	0.0453	0.1207	0.0517	0.0724	0.2803	0.0604	0.1207	0.1811	0.0453
Company-4: M11	0.0866	0.0666	0.0178	0.1110	0.0476	0.0555	0.0833	0.1577	0.2465	0.1665	0.0476
Company-4: M12	0.0720	0.0614	0.0526	0.1228	0.0737	0.0921	0.0460	0.0249	0.2963	0.1842	0.0460
Company-5: M13	0.0829	0.0223	0.0524	0.1832	0.2836	0.0733	0.1222	0.0524	0.0916	0.0733	0.0458
Company-5: M14	0.1021	0.0743	0.0186	0.1857	0.2692	0.0743	0.0464	0.0619	0.0928	0.1238	0.0531
Company-5: M15	0.0603	0.1063	0.0819	0.1638	0.0546	0.0468	0.0819	0.0655	0.1092	0.2672	0.0230
Average Weights	0.0819	0.0653	0.0542	0.1761	0.0965	0.0709	0.1136	0.0583	0.1647	0.1576	0.0429

Abbreviation: CSF, critical success factor.

TABLE 10 Final ranking of CSFs for CE practices

Notation	Name of CSFs	Rank
CSF ₃	Leadership and top management commitment	1
CSF ₈	Practices of reverse logistics	2
CSF ₉	Capacity-building and information management for CE	3
CSF ₆	Strong legislation towards CE	4
CSF ₄	Appropriate facilities for waste recycling and reuse	5
CSF ₅	Ecological scarcity of resources	6
CSF ₁	Eco-design for waste management	7
CSF ₇	Knowledge of CE	8
CSF ₂	Funding support for R&D from government	9
CSF ₁₀	Competitor pressure towards CE	10

Abbreviations: CE, circular economy; CSF, critical success factor.

italics in the total relation matrix and showed their interactions with other CSFs in Figure 3.

5 | RESULTS AND DISCUSSION

This research focuses on CSFs as a pivotal driving force to implement CE practices in the context of the leather industry of Bangladesh. The research findings of this study were discussed with industrial decision makers to assist them in successfully implementing a CE strategy to

promote waste minimization and develop a sustainable business environment.

Based on the findings of this study, “leadership and top management commitment (CSF₃)” is ranked first (see Table 10), which indicates the importance of this success factor for the implementation of CE practices in the SC. Furthermore, in the DEMATEL analysis, it received a positive ($r_i - c_j$) value of 0.8749 (see Table 14), indicating it is a causal CSF. If decision makers give special attention to this CSF, it will aid the facilitation of CSFs in the effect group during the implementation of CE strategies. This suggests that special emphasis should be placed on this factor during strategic planning. This finding is also contradicted by other studies from developed countries. For example, Gusmerotti, Testa, Corsini, Pretner, and Iraldo (2019) showed that economic drivers were the most crucial drivers for encouraging “linear companies” to adopt CE practices for the manufacturing firms. Saeed and Kersten (2019) assessed drivers for sustainable SC practices and said that regulation and market pressure are the prevailing driving factors for manufacturing firms. Sharma, Mangla, Patil, and Liu (2019) tried to evaluate the challenges for CE and sustainability and mentioned that poor governmental policy is the driving challenge for developing countries. The result of this study also aligns with previous studies, but none of those found the interaction between drivers of sustainable SCM and CE. For instance, the CSF “leadership and top management commitment (CSF₃)” has already been proven to drive policy makers to implement sustainable manufacturing practices in other SCs (Moktadir, Ali, Rajesh et al., 2018). Gardas, Raut, and Narkhede (2019) also demonstrated the CSFs of the reusable plastic packaging system and confirmed that top management commitment is an important factor for CE implementation in reusable polymer processing.

TABLE 11 Average matrix

CSFs	CSF ₃	CSF ₈	CSF ₉	CSF ₆	CSF ₄	CSF ₅	CSF ₁	CSF ₇	CSF ₂	CSF ₁₀
CSF ₃	0.000	6.222	7.444	3.444	6.777	3.555	7.222	3.778	3.111	3.556
CSF ₈	2.888	0.000	7.222	3.000	7.222	3.666	6.778	3.333	2.556	3.111
CSF ₉	2.444	6.888	0.000	4.222	7.333	3.778	6.111	4.111	3.667	3.444
CSF ₆	4.000	6.444	6.333	0.000	6.777	4.111	7.333	4.222	3.778	3.889
CSF ₄	3.222	7.111	6.444	4.666	0.000	3.889	7.556	3.444	2.556	4.556
CSF ₅	3.444	6.555	6.666	4.111	6.333	0.000	6.667	4.778	2.889	3.889
CSF ₁	3.111	8.222	6.888	4.222	7.444	3.222	0.000	3.778	2.444	3.556
CSF ₇	3.555	6.666	7.000	4.888	7.111	5.222	6.222	0.000	3.000	3.556
CSF ₂	3.111	5.666	6.222	4.111	6.111	4.667	6.333	4.667	0.000	4.222
CSF ₁₀	2.888	6.555	6.888	4.555	6.666	4.778	6.778	3.556	3.444	0.000

Abbreviation: CSF, critical success factor.

TABLE 12 Normalized direct relation matrix (P)

CSFs	CSF ₃	CSF ₈	CSF ₉	CSF ₆	CSF ₄	CSF ₅	CSF ₁	CSF ₇	CSF ₂	CSF ₁₀
CSF ₃	0.000	0.101	0.121	0.056	0.109	0.058	0.117	0.061	0.051	0.058
CSF ₈	0.047	0.000	0.117	0.049	0.117	0.059	0.109	0.054	0.042	0.051
CSF ₉	0.039	0.112	0.000	0.068	0.119	0.061	0.099	0.067	0.059	0.056
CSF ₆	0.065	0.104	0.103	0.000	0.109	0.067	0.119	0.068	0.061	0.063
CSF ₄	0.052	0.115	0.104	0.076	0.000	0.063	0.122	0.056	0.042	0.074
CSF ₅	0.056	0.106	0.108	0.067	0.103	0.000	0.108	0.077	0.047	0.063
CSF ₁	0.051	0.133	0.112	0.068	0.121	0.052	0.000	0.061	0.039	0.058
CSF ₇	0.058	0.108	0.113	0.079	0.115	0.085	0.101	0.000	0.049	0.058
CSF ₂	0.051	0.092	0.101	0.067	0.098	0.076	0.103	0.076	0.000	0.068
CSF ₁₀	0.047	0.106	0.112	0.074	0.108	0.077	0.109	0.058	0.056	0.000

Abbreviation: CSF, critical success factor.

TABLE 13 Total relation matrix (T)

CSFs	CSF ₃	CSF ₈	CSF ₉	CSF ₆	CSF ₄	CSF ₅	CSF ₁	CSF ₇	CSF ₂	CSF ₁₀
CSF ₃	0.121	0.343	0.357	0.209	0.353	0.206	0.354	0.206	0.164	0.197
CSF ₈	0.152	0.224	0.326	0.187	0.332	0.191	0.320	0.184	0.143	0.177
CSF ₉	0.152	0.335	0.233	0.211	0.345	0.201	0.323	0.201	0.164	0.187
CSF ₆	0.187	0.355	0.352	0.163	0.363	0.220	0.365	0.218	0.178	0.208
CSF ₄	0.166	0.346	0.335	0.222	0.246	0.206	0.349	0.196	0.152	0.206
CSF ₅	0.175	0.348	0.348	0.221	0.349	0.153	0.347	0.221	0.167	0.203
CSF ₁	0.163	0.357	0.337	0.213	0.350	0.195	0.237	0.199	0.148	0.191
CSF ₇	0.181	0.359	0.362	0.238	0.369	0.237	0.352	0.156	0.167	0.204
CSF ₂	0.169	0.335	0.341	0.221	0.345	0.224	0.342	0.220	0.117	0.208
CSF ₁₀	0.169	0.352	0.355	0.229	0.357	0.228	0.353	0.207	0.172	0.146

Note: **Threshold value** = Mean + Standard deviation = 0.2477 + 0.0794 = 0.3271.

Abbreviation: CSF, critical success factor.

The CSF "practices of reverse logistics (CSF₈)" received the second position in the BWM analysis (see Table 10), indicating that practices of reverse logistics can enhance the overall performance of CE implementations. In the DEMATEL analysis, this factor received a negative value -1.1218 of $r_i - c_j$, indicating the significant influence that

other factors have on this CSF (see Table 14). Therefore, attention to the causal factors may have a positive impact on this CSF. The literature shows that reverse logistics practices may help achieve a sustainable business environment by minimizing waste in SCs (Yunkai, 2009). Gardas et al. (2019) noticed that the reverse SC for reusable plastic

TABLE 14 Causal impact of CSFs

Name of CSFs	r_i	c_j	$r_i + c_j$	$r_i - c_j$	Impact
CSF_3	2.5110	1.6361	4.1471	0.8749	Cause
CSF_8	2.2346	3.3564	5.5909	-1.1218	Effect
CSF_9	2.3535	3.3468	5.7003	-0.9933	Effect
CSF_6	2.6096	2.1141	4.7237	0.4955	Cause
CSF_4	2.4258	3.4095	5.8354	-0.9837	Effect
CSF_5	2.5281	2.0621	4.5901	0.4660	Cause
CSF_1	2.3913	3.3429	5.7342	-0.9516	Effect
CSF_7	2.6273	2.0090	4.6363	0.6183	Cause
CSF_2	2.5224	1.5681	4.0904	0.9543	Cause
CSF_{10}	2.5673	1.9261	4.4934	0.6413	Cause

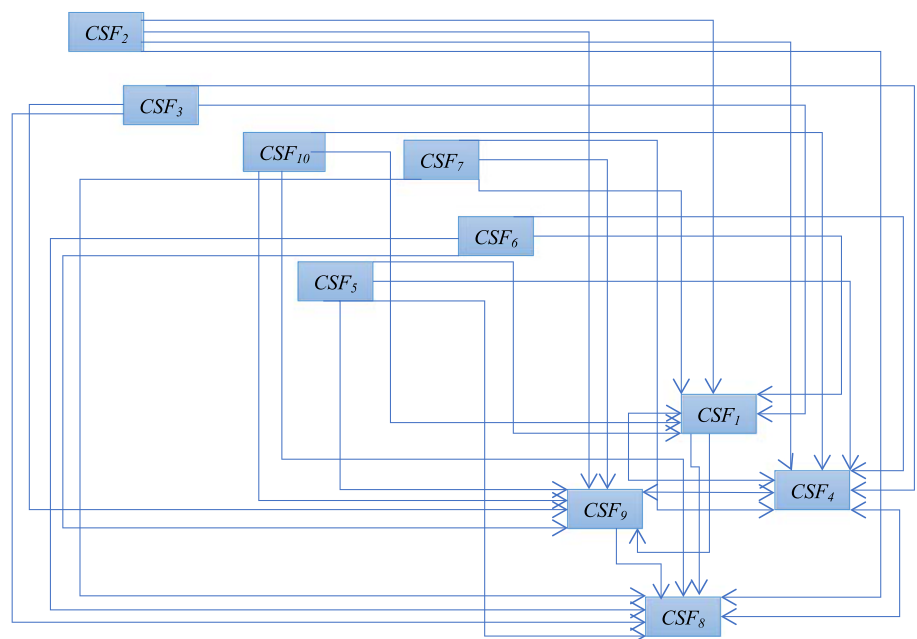
Abbreviation: CSF, critical success factor.

products is an important issue for CE practices. Moktadir et al. (2018b) identified a lack of reverse logistics practices as an influential barrier for sustainable SC practices in the leather SCs. Bernon, Tjahjono, and Ripanti (2018) showed the importance of reverse logistics practices for CE implementation and urged that reverse logistics practices can help manufacturing firms to achieve sustainability.

Next, "capacity-building and information management for CE (CSF_9)" received the third position in the BWM analysis (see Table 10). This CSF is an important factor for the current situation in Bangladesh. Bangladesh is a developing country, and capacity building for information management for CE practices remains a challenging issue. Capacity building may drive the implementation process by facilitating the collection and integration of data throughout the SCs. Information management and capacity building can be improved by improving the causal CSFs, as it received a negative $r_i - c_j$ value of -0.9933, indicating it is in the effect group. Previous research has not considered this factor for CE implementations. Information

management is an important task for the CE implementation process. Without the proper information management facility, it will not be possible to introduce CE practices into the existing SCs. Moktadir et al. (2018b) did not consider this factor for the implementation of sustainable manufacturing practices in leather industry SCs. Some studies, such as Wang, Che, Fan, and Gu (2014), showed the interrelationship between CE accounting information and CE practices, whereas Wei (2014) demonstrated the importance of strategic enterprise management for CE practices. Singh et al. (2019) showed the importance of information technology for achieving sustainable growth for the Indian food industry. Therefore, information management and capacity building can act as a driving factor for CE implementation, and this factor can be improved by attention to causal factors.

"Strong legislation towards CE (CSF_6)" has received the fourth position in the BWM analysis (see Table 10), and in the DEMATEL analysis, it falls into the causal group along with a positive value 0.4955 of $r_i - c_j$. It is a crucial factor for the successful implementation of CE practices in the Bangladeshi leather industry. Strong legislative power may force the industry decision-makers to initiate CE practices in the SCs. This factor is very important in the current leather SCs, as mentioned in previous studies (Moktadir, Ali, Kusi-Sarpong et al., 2018; Moktadir, Ali, Rajesh et al., 2018). The leather industry is greatly responsible for environmental degradation by producing a huge amount of waste. If strong legislation is imposed, then the industry decision makers will facilitate more funds for CE implementation, which will, in turn, help minimize environmental degradation. Kirchherr, Reike, and Hekkert (2017) examined existing CE literature and confirmed that legislative policy is an imperative issue for the successful implementation of CE practices. Lewandowski (2016) conducted a review of CE and mentioned that CE practices are now spreading throughout the world with the aim of achieving social, environmental, and economic sustainability of business activities. Prieto-Sandoval, Jaca, and Ormazabal (2018) gave an overview of the CE, focusing on the

**FIGURE 3** Cause-effect relationships between CSFs for CEs [Colour figure can be viewed at [wileyonlinelibrary.com](https://onlinelibrary.wiley.com)]

consensus view of CE and agreed that legislative power is an important driver of CE practices. Korhonen et al. (2018) demonstrated that CE contributes to the achievement of social sustainability.

"Appropriate facilities for waste recycling and reuse (CSF_4)" is also an important CSF for CE implementation in the context of the leather industry. This CSF received the fifth position in the BWM analysis (see Table 10). This finding provides deep insight into it for the reduction of raw material, water, and energy consumption in SCs. Consequently, in DEMATEL analysis, this CSF falls into the effect group along with a negative $r_i - c_j$ value of -0.9837 so that causal CSFs may influence it during the implementation of CE practices. Therefore, policy makers may take it as a less critical CSF as it can be improved by addressing the causal group CSFs. A study by Nainggolan et al. (2019) showed consumer behavior in a CE for household waste. This research indicated that appropriate recycling facilities could be the best tool for CE practices. de Oliveira, Luna, and Campos (2019) demonstrated the impact of reverse logistics for CE practices in the polystyrene SC in a Brazilian context. Kokkinos, Proskynitopoulou, and Zouboulis (2019) demonstrated techniques of chromium and energy recovery for CE implementation in the tannery industry and confirmed that appropriate recovery techniques can be enacted as crucial success factors for waste recovery. Cusenza, Guarino, Longo, Ferraro, and Cellura (2019) showed the importance of CE in the domain of used electric vehicle batteries and mentioned that suitable facilities for waste recycling and reuse can improve a firm's sustainability. These studies confirm that appropriate recycling techniques and reuse facilities can greatly assist decision makers in the implementation of CE and can help achieve sustainability in the SC networks.

"Ecological scarcity of resources (CSF_5)" received the sixth position in the BWM analysis (see Table 10), and in DEMATEL, it fell under the cause category as this CSF received a positive $r_i - c_j$ value of 0.4660 . This means that improving this CSF may significantly drive the CSF effect group. Ecological scarcity of resources is a causal CSF because the scarcity of natural resources may prompt decision makers to reduce material usage by reducing waste in the SCs. Global resources are limited, and material consumption needs to be reduced to create sustainable business frameworks. Literature has shown that the scarcity of resources is an important issue for sustainable resource management (de Jesus, Antunes, Santos, & Mendonça, 2019; Svensson & Funck, 2019), and in this case, CE practices can help minimize material consumption by reducing waste and reusing waste materials.

"Eco-design for waste management (CSF_1)" is an important CSF for the leather industry due to the massive amount of tannery effluent produced during the manufacturing process. Eco-design may help facilitate the implementation of CE practices in the SCs. It was ranked seventh by the BWM analysis (see Table 10), and it is in the CSF effect group with a negative value ($r_i - c_j$) of -0.9516 , indicating it may be influenced by the causal CSFs. Strong legislation and funding may significantly support the realization of an eco-design framework in the leather manufacturing industry. A study by Hidalgo, Martín-Marroquín, and Corona (2019) proposed a multiwaste plan for waste recovery for the implementation of CE. The authors demonstrated the

process of waste reduction for CE policy. de Jesus et al. (2019) showed the eco-innovation pathways for CE practices and suggested that proper design for eco-efficiency may be achieved via eco-innovative SC design.

The last three CSFs, "knowledge of CE (CSF_7)," "funding support for R&D from the government (CSF_2)," and "competitor pressure towards CE (CSF_{10})" all fall into the causal group along with positive values ($r_i - c_j$) of 0.6183 , 0.9543 , and 0.6413 accordingly, which indicates the importance of these CSFs during the implementation process (see Table 14). Knowledge of CE practices is an important CSF as it may motivate industry decision makers to implement CE in their SCs and educate the SC managers about the importance of CE practices. Hankammer, Brenk, Fabry, Nordemann, and Piller (2019) demonstrated the consumer need for CE business models, which indicated that knowledge of CE is another vital issue for CE implementation. Svensson and Funck (2019) investigated the management control system and its importance for CE practices. Funding support from the government is a causal CSF as it could facilitate the redesign of SC networks necessary for the implementation of CE practices. Sauerwein, Doubrovski, Balkenende, and Bakker (2019) explained the importance of additive manufacturing in the context of CE and agreed that funding is an essential issue for CE implementation. Lastly, competitor pressure towards CE also falls into the causal group and has a strong influence on effect group CSFs. Business is competitive and requires sustainable business models. In this context, CE may help achieve a sustainable business environment and sustainability (de Sousa Jabbour et al., 2019). Morrissey, Franceschi, and Ferreira (2019) mentioned that the fashion industry is facing difficulties achieving sustainability in SCs. Hence, CE practices can give direction to the entire global market. Therefore, attention to these causal CSFs may significantly improve the whole system. From Figure 3, it is clear which CSFs can derive others and the interrelationships between them. The details of these interrelationships are very important for the implementation process.

The above explanations indicate that the success factors for CE implementation still exist within a gap in the research, and this study explores and enhances the literature by filling these gaps.

6 | RESEARCH IMPLICATIONS

6.1 | Practical implications

This research focuses on how CSFs act as pivotal driving forces in the implementation of CE practices in the context of the leather industry in Bangladesh. The priority and cause/effect-based analysis of CSFs can help managers in the leather industry better understand factors needed to successfully implement CE practices for waste minimization and support the development of a sustainable business environment. In addition to leather industry managers, there are also implications for policy makers and the wider public. This research offers numerous implications mentioned as follows.

- This study found that “leadership and top management commitment” is both the highest-ranked success factor and a causal factor. This suggests that a strong commitment from management will be required for the successful implementation of CE practices in the leather industry (Jabbour et al., 2019; Kumar et al., 2018). This will need to be reflected by an ongoing leadership style that supports initiatives in CE practice and motivates staff to do likewise, in order to achieve the ultimate objectives in a timely manner (Jabbour et al., 2019; Kumar et al., 2018).
- The second most important factor is “strong legislation towards CE,” which shows that strong legislation by the country's government is of paramount importance. For instance, the Chinese government has officially acknowledged CE as a central, sustainable development strategy and sees its successful enforcement as a way to tackle its urgent problems of environmental degradation and resource scarcity (Su, Heshmati, Geng, & Yu, 2013; Ali, Kennedy, Kiesecker, & Geng 2018; Jia, Zuluaga-Cardona, Bailey, & Rueda, 2018; Batista, Gong, Pereira, Jia, & Bittar, 2018). Hence, the Bangladeshi government should develop strong legislation and policies for CE practices for the leather industry, so that sustainable development can be achieved.
- We have limited resources for a rapidly growing world population. However, by managing waste, we can better manage the scarcity of resources. Industries should take strong steps to initiate and adhere to the reuse, recycle, and remanufacture strategy in order to minimize waste. This CE strategy helps minimize material consumption by reusing waste materials and reducing waste generation.
- Other causal factors such as knowledge of CE, funding support for R&D from the government, and competitor pressure towards CE all play critical roles in the proper implementation of CE initiatives in different industries. Therefore, the leather industry of Bangladesh should adopt some of these approaches. For example, the industry should provide employees with training in CE practices and make these initiatives known to encourage competitors to do likewise (Batista et al., 2018; Kumar et al., 2018). The Bangladeshi government should provide funding support to the industry so it can enhance its research and development activities in this direction.

6.2 | Theoretical implications

This research also makes certain unique theoretical contributions.

- This research focuses on the CSFs in the context of leather industry SCs, which is ignored in the existing literature and confirmed in the literature review (Chiappetta Jabbour et al., 2019; Gardas et al., 2019; Gusmerotti et al., 2019; Sharma et al., 2019; Simon, 2019). Existing studies focus either on the basic concept of CE or on other industries.
- Theoretically, this study contributes to the CE literature by offering two new CSFs, which are unique in the CE literature.

- This research aims to show how a combined methodology (i.e., BWM and DEMATEL) helps to find the importance of the CSFs along with the interrelationship between them. In this study, qualitative feedback was collected and employed in the decision-making model to determine important CSFs and their cause/effect relationships. This methodology is unique because of the implementation of the industry–employee feedback in the BWM–DEMATEL process in the context of CE and CSFs evaluation; this is supported by a review of recent existing studies (Gardas et al., 2019; Sharma et al., 2019).

7 | CONCLUDING REMARKS

In today's competitive business network, CE is an important research topic. All types of businesses are striving to make themselves eco-efficient and optimize their resources. Likewise, CE practices in SCs are attracting more attention from researchers. This study is an attempt to help the leather industry identify how to implement CE practices in their SCs. From a conceptual point of view, the research identifies the CSFs for CE practices in the leather industry SCs. This was achieved via literature review and procurement of expert opinions. An integrated approach using both BWM and DEMATEL methods was employed to reach the desired objectives. BWM was used to prioritize the CSFs, and DEMATEL was employed to extract interrelationships between CSFs for CE practices in the SC context. Ten CSFs were validated after an extensive literature review and input from experts from the Bangladeshi leather industry. The data show that the CSFs of “leadership and top management commitment,” “practices of reverse logistics,” “capacity-building and information management for CE,” “strong legislation towards CE,” and “appropriate facilities for waste recycling and reuse” are the highest priority factors. However, the factors of “leadership and top management commitment,” “strong legislation towards CE,” “ecological scarcity of resources,” “knowledge on CE,” “funding support for R&D from the government,” and “competitor pressure towards CE” were causal factors. The outcomes of this research could potentially help leather industry managers, and practitioners decide where to concentrate their efforts to implement CE practices in their SCs. The significant contributions of this research have been described in the previous section, indicating this study has a great impact on CE literature, especially for the leather industry SCs. This study will help build CE practices for the betterment of society and the environment.

This study has some limitations: (i) It only focused on the leather industry of Bangladesh, which is constrained to external generalization; (ii) a limited number of case companies and experts were involved during the data collection process; and (iii) a limited number of CSFs were investigated. Therefore, to overcome these limitations, a cross-country study could be conducted in order to generalize critical insights on the CSFs for CE. In this study, we used BWM for ten factors (all in one category), which might have affected the reliability of the findings (it is suggested not to use more than nine criteria for pairwise comparisons under a single category). Further, future

research can try to measure the impact of the proposed CSFs on the performance of the leather industry using a life cycle assessment approach. Additionally, researchers can advance this research considering the role of government initiatives on the successful implementation of CE in different industries.

ORCID

Md. Abdul Moktadir  <https://orcid.org/0000-0003-1852-7815>

Anil Kumar  <https://orcid.org/0000-0002-1691-0098>

Sanjoy Kumar Paul  <https://orcid.org/0000-0001-9523-179X>

REFERENCES

- Abbey, J. D., Geismar, H. N., & Souza, G. C. (2019). Improving remanufacturing core recovery and profitability through seeding. *Production and Operations Management*, 28, 610–627. <https://doi.org/10.1111/poms.12937>
- Acquaye, A., Ibn-Mohammed, T., Genovese, A., Afrifa, G. A., Yamoah, F. A., & Oppon, E. (2018). A quantitative model for environmentally sustainable supply chain performance measurement. *European Journal of Operational Research*, 269(1), 188–205. <https://doi.org/10.1016/j.ejor.2017.10.057>
- Ali, K., Moktadir, M. A., Shaikh, A. A., Deb, A. K., & Rashed-Ul-Islam, M. (2018). Challenges evaluation for adoption of SCP practices in footwear industry of Bangladesh: A DEMATEL approach. *Journal of Operations and Strategic Planning*, 1(2), 168–184. <https://doi.org/10.1177/2516600X18812984>
- Ali, M., Kennedy, C. M., Kiesecker, J., & Geng, Y. (2018). Integrating biodiversity offsets within Circular Economy policy in China. *Journal of Cleaner Production*, 185, 32–43. <https://doi.org/10.1016/j.jclepro.2018.03.027>
- Ahmadi, H. B., Kusi-Sarpong, S., & Rezaei, J. (2017). Assessing the social sustainability of supply chains using Best Worst Method. *Resources, Conservation and Recycling*, 126, 99–106. <https://doi.org/10.1016/j.resconrec.2017.07.020>
- Baldassarre, B., Schepers, M., Bocken, N., Cuppen, E., Korevaar, G., & Calabretta, G. (2019). Industrial Symbiosis: towards a design process for eco-industrial clusters by integrating circular economy and industrial ecology perspectives. *Journal of Cleaner Production*, 216, 446–460. <https://doi.org/10.1016/j.jclepro.2019.01.091>
- Batista, L., Gong, Y., Pereira, S., Jia, F., & Bittar, A. (2018). Circular supply chains in emerging economies—a comparative study of packaging recovery ecosystems in China and Brazil. *International Journal of Production Research*, 1–21.
- Bernon, M., Tjahjono, B., & Ripanti, E. F. (2018). Aligning retail reverse logistics practice with circular economy values: An exploratory framework. *Production Planning & Control*, 29(6), 483–497. <https://doi.org/10.1080/09537287.2018.1449266>
- Bililewski, B. (2007). Circular economy in Germany. *Proceedings Sardinia Margherita Di Pula*, 1(5).
- Blomsma, F. (2018). Collective "action recipes" in a circular economy—On waste and resource management frameworks and their role in collective change. *Journal of Cleaner Production*, 199, 969–982. <https://doi.org/10.1016/j.jclepro.2018.07.145>
- Bressanelli, G., Adrodegari, F., Perona, M., & Saccani, N. (2018). The role of digital technologies to overcome Circular Economy challenges in PSS Business Models: an exploratory case study. *Procedia CIRP*, 73(2018), 216–221.
- Caniato, F., Caridi, M., Crippa, L., & Moretto, A. (2012). Environmental sustainability in fashion supply chains: An exploratory case based research. *International Journal of Production Economics*, 135(2), 659–670. <https://doi.org/10.1016/j.ijpe.2011.06.001>
- Centobelli, P., Cerchione, R., Chiaroni, D., Del Vecchio, P., & Urbinati, A. (2020). Designing business models in circular economy: A systematic literature review and research agenda. *Business Strategy and the Environment*, 29(4), 1734–1749. [bse.2466](https://doi.org/10.1002/bse.2466)
- Chen, Z., Lu, M., Ming, X., Zhang, X., & Zhou, T. (2020). Explore and evaluate innovative value propositions for smart product service system: A novel graphics-based rough-fuzzy DEMATEL method. *Journal of Cleaner Production*, 243, 118672. <https://doi.org/10.1016/j.jclepro.2019.118672>
- Chowdhury, P., & Paul, S. K. (2020). Applications of MCDM methods in research on corporate sustainability: A systematic literature review. *Management of Environmental Quality: An International Journal*, 31(2), 385–405. <https://doi.org/10.1108/MEQ-12-2019-0284>
- Cusenza, M. A., Guarino, F., Longo, S., Ferraro, M., & Cellura, M. (2019). Energy and environmental benefits of circular economy strategies: The case study of reusing used batteries from electric vehicles. *Journal of Energy Storage*, 25, 100845. <https://doi.org/10.1016/j.est.2019.100845>
- Dewi, K. C., Ciptayani, P. I., Surjono, H. D., & Priyanto (2018). Critical success factor for implementing vocational blended learning. In *Journal of Physics: Conference Series* (Vol. 953). Bali, Indonesia: IOP Publishing Ltd.
- Ding, B. (2018). Pharma Industry 4.0: Literature review and research opportunities in sustainable pharmaceutical supply chains. *Process Safety and Environmental Protection*, 119, 115–130. <https://doi.org/10.1016/j.psep.2018.06.031>
- Ding, H., Zhao, Q., An, Z., & Tang, O. (2016). Collaborative mechanism of a sustainable supply chain with environmental constraints and carbon caps. *International Journal of Production Economics*, 181, 191–207. <https://doi.org/10.1016/j.ijpe.2016.03.004>
- Dinter, B. (2013). Success factors for information logistics strategy—An empirical investigation. *Decision Support Systems*, 54(3), 1207–1218. <https://doi.org/10.1016/j.dss.2012.09.001>
- EMF. 2013. Growth Within: A circular economy vision for a competitive Europe Available from: <http://www.ellenmacarthurfoundation.org/>
- ESA 2013. Going for Growth: A practical route to a Circular Economy. from http://www.esauk.org/esa_reports/Circular_Economy_Report_FINAL_High_Res_For_Release.pdf
- EPB Report, (2018). http://epb.gov.bd/site/view/epb_export_data/2018-2019 .
- EPI Report, (2018). <https://epi.envirocenter.yale.edu/2018/report/category/hlt> .
- Flynn, A., & Hacking, N. (2019). Setting standards for a circular economy: A challenge too far for neoliberal environmental governance? *Journal of Cleaner Production*, 212, 1256–1267. <https://doi.org/10.1016/j.jclepro.2018.11.257>
- Frei, R., Jack, L., & Krzyzaniak, S. (2020). Sustainable reverse supply chains and circular economy in multichannel retail returns. *Business Strategy and the Environment*, bse.2479, 29, 1925–1940. <https://doi.org/10.1002/bse.2479>
- Gabus, A., & Fontela, E. (1972). *World Problems, An Invitation to Further Thought within The Framework of DEMATEL*. Geneva, Switzerland: Battelle Geneva Research Centre.
- García-Barragán, J. F., Eyckmans, J., & Rousseau, S. (2019). Defining and measuring the circular economy: A mathematical approach. *Ecological Economics*, 157, 369–372. <https://doi.org/10.1016/j.ecolecon.2018.12.003>
- Gardas, B. B., Raut, R. D., & Narkhede, B. (2019). Identifying critical success factors to facilitate reusable plastic packaging towards sustainable supply chain management. *Journal of Environmental Management*, 236, 81–92. <https://doi.org/10.1016/j.jenvman.2019.01.113>
- Geissdoerfer, M., Savaget, P., Bocken, N. M. P., & Hultink, E. J. (2017). The circular economy—A new sustainability paradigm? *Journal of Cleaner Production*, 143, 757–768. <https://doi.org/10.1016/j.jclepro.2016.12.048>

- Genovese, A., Acquaye, A. A., Figueroa, A., & Koh, S. C. L. (2017). Sustainable supply chain management and the transition towards a circular economy: Evidence and some applications. *Omega (United Kingdom)*, 66, 344–357.
- Govindan, K., & Hasanagic, M. (2018). A systematic review on drivers, barriers, and practices towards circular economy: A supply chain perspective. *International Journal of Production Research*, 56(1–2), 278–311. <https://doi.org/10.1080/00207543.2017.1402141>
- Gusmerotti, N. M., Testa, F., Corsini, F., Pretner, G., & Iraldo, F. (2019). Drivers and approaches to the circular economy in manufacturing firms. *Journal of Cleaner Production*, 230, 314–327. <https://doi.org/10.1016/j.jclepro.2019.05.044>
- Hankammer, S., Brenk, S., Fabry, H., Nordemann, A., & Piller, F. T. (2019). Towards circular business models: Identifying consumer needs based on the jobs-to-be-done theory. *Journal of Cleaner Production*, 231, 341–358. <https://doi.org/10.1016/j.jclepro.2019.05.165>
- Hazen, B. T., Mollenkopf, D. A., & Wang, Y. (2017). Remanufacturing for the circular economy: An examination of consumer switching behavior. *Business Strategy and the Environment*, 26(4), 451–464. <https://doi.org/10.1002/bse.1929>
- Heyes, G., Sharmina, M., Mendoza, J. M. F., Gallego-Schmid, A., & Azapagic, A. (2018). Developing and implementing circular economy business models in service-oriented technology companies. *Journal of Cleaner Production*, 177, 621–632. <https://doi.org/10.1016/j.jclepro.2017.12.168>
- Hidalgo, D., Martín-Marroquín, J. M., & Corona, F. (2019). A multi-waste management concept as a basis towards a circular economy model. *Renewable and Sustainable Energy Reviews*, 111, 481–489. <https://doi.org/10.1016/j.rser.2019.05.048>
- Hong, S. C. (2018). Why is developing the leather industry important? *ADB Briefs*, 102, 1–8.
- Huysveld, S., Hubo, S., Ragaert, K., & Dewulf, J. (2019). Advancing circular economy benefit indicators and application on open-loop recycling of mixed and contaminated plastic waste fractions. *Journal of Cleaner Production*, 211, 1–13. <https://doi.org/10.1016/j.jclepro.2018.11.110>
- Jabbour, C. J. C., Sarkis, J., de Sousa Jabbour, A. B. L., Renwick, D. W. S., Singh, S. K., Grebnevych, O., & Godinho Filho, M. (2019). Who is in charge? A review and a research agenda on the 'human side' of the circular economy. *Journal of Cleaner Production*, 222, 793–801. <https://doi.org/10.1016/j.jclepro.2019.03.038>
- de Jesus, A., Antunes, P., Santos, R., & Mendonça, S. (2019). Eco-innovation pathways to a circular economy: Envisioning priorities through a Delphi approach. *Journal of Cleaner Production*, 228, 1494–1513. <https://doi.org/10.1016/j.jclepro.2019.04.049>
- Jia, F., Zuluaga-Cardona, L., Bailey, A., & Rueda, X. (2018). Sustainable supply chain management in developing countries: An analysis of the literature. *Journal of Cleaner Production*, 189, 263–278. <https://doi.org/10.1016/j.jclepro.2018.03.248>
- Kalverkamp, M., & Young, S. B. (2019). In support of open-loop supply chains: Expanding the scope of environmental sustainability in reverse supply chains. *Journal of Cleaner Production*, 214, 573–582. <https://doi.org/10.1016/j.jclepro.2019.01.006>
- Katz-Gerro, T., & López Sintas, J. (2018). Mapping circular economy activities in the European Union: Patterns of implementation and their correlates in small and medium-sized enterprises. *Business Strategy and the Environment*, 1–12. <https://doi.org/10.1002/bse.2259>
- Kelle, P., Song, J., Jin, M., Schneider, H., & Claypool, C. (2019). Evaluation of operational and environmental sustainability tradeoffs in multimodal freight transportation planning. *International Journal of Production Economics*, 209, 411–420. <https://doi.org/10.1016/j.ijpe.2018.08.011>
- Kheybari, S., Kazemi, M., & Rezaei, J. (2019). Bioethanol facility location selection using best-worst method. *Applied Energy*, 242, 612–623. <https://doi.org/10.1016/j.apenergy.2019.03.054>
- Kirchherr, J., Hekkert, M., Bour, R., Huibrechtse-Truijens, A., Kostense-Smit, E., & Muller, J. (2017). Breaking the barriers to the circular economy. *Deloitte*, (October), 1–13.
- Kirchherr, J., Piscicelli, L., Bour, R., Kostense-Smit, E., Muller, J., Huibrechtse-Truijens, A., & Hekkert, M. (2018). Barriers to the circular economy: Evidence from the European Union (EU). *Ecological Economics*, 150, 264–272. <https://doi.org/10.1016/j.ecolecon.2018.04.028>
- Kirchherr, J., Reike, D., & Hekkert, M. (2017). Conceptualizing the circular economy: An analysis of 114 definitions. *Resources, Conservation and Recycling*, 127(September), 221–232. <https://doi.org/10.1016/j.resconrec.2017.09.005>
- Kluczek, A. (2019). An energy-led sustainability assessment of production systems—An approach for improving energy efficiency performance. *International Journal of Production Economics*, 216, 190–203. <https://doi.org/10.1016/j.ijpe.2019.04.016>
- Koberg, E., & Longoni, A. (2019). A systematic review of sustainable supply chain management in global supply chains. *Journal of Cleaner Production*, 207, 1084–1098. <https://doi.org/10.1016/j.jclepro.2018.10.033>
- Kokkinos, E., Proskynitopoulou, V., & Zouboulis, A. (2019). Chromium and energy recovery from tannery wastewater treatment waste: Investigation of major mechanisms in the framework of circular economy. *Journal of Environmental Chemical Engineering*, 7(5), 103307. <https://doi.org/10.1016/j.jece.2019.103307>
- Korhonen, J., Honkasalo, A., & Seppälä, J. (2018). Circular economy: The concept and its limitations. *Ecological Economics*, 143, 37–46. <https://doi.org/10.1016/j.ecolecon.2017.06.041>
- Kumar, A., Mangla, S. K., Luthra, S., & Ishizaka, A. (2018). Evaluating the human resource related soft dimensions in green supply chain management implementation. *Production Planning & Control*, 30(9), 699–715.
- Kusi-Sarpong, S., Gupta, H., Khan, S. A., Jabbour, C. J. C., Rehman, S. T., & Kusi-Sarpong, H. (2019). Sustainable supplier selection based on industry 4.0 initiatives within the context of circular economy implementation in supply chain operations. *Production Planning and Control*, (In press)
- Kweka, J., Yoshino, Y., Monga, C., Yagci, F., Dinh, H. T., & Morisset, J. (2014). Leather and Leather Products. In *Light Manufacturing in Tanzania* (pp. 65–72).
- Kwon, H.-B., & Lee, J. (2019). Exploring the differential impact of environmental sustainability, operational efficiency, and corporate reputation on market valuation in high-tech-oriented firms. *International Journal of Production Economics*, 211, 1–14. <https://doi.org/10.1016/j.ijpe.2019.01.034>
- Lewandowski, M. (2016). Designing the business models for circular economy—Towards the conceptual framework. *Sustainability*, 8(43), 1–28. <https://doi.org/10.3390/su8010043>
- Liang, F., Brunelli, M., & Rezaei, J. (2019). Consistency issues in the best worst method: Measurements and thresholds. *Omega*, 102175.
- van Loon, P., Delagarde, C., & Van Wassenhove, L. N. (2018). The role of second-hand markets in circular business: A simple model for leasing versus selling consumer products. *International Journal of Production Research*, 56(1–2), 960–973. <https://doi.org/10.1080/00207543.2017.1398429>
- van Loon, P., & Van Wassenhove, L. N. (2018). Assessing the economic and environmental impact of remanufacturing: A decision support tool for OEM suppliers. *International Journal of Production Research*, 56(4), 1662–1674. <https://doi.org/10.1080/00207543.2017.1367107>
- Lozowski, D. (2018). Embracing a circular economy. *Chemical Engineering*, 5.
- Lu, Z. B., & Ye, M. (2007). The design on reverse logistics networks based on circulation economy. In *Proceedings of 2007 International Conference on Construction & Real Estate Management*, 1 and 2 (pp. 848–850). Guangzhou, China: American Society of Civil Engineers.

- Luttenberger, L. R. (2020). Waste management challenges in transition to circular economy—Case of Croatia. *Journal of Cleaner Production*, 256, 120495. <https://doi.org/10.1016/j.jclepro.2020.120495>
- Mahpour, A. (2018). Prioritizing barriers to adopt circular economy in construction and demolition waste management. *Resources, Conservation and Recycling*, 134, 216–227. <https://doi.org/10.1016/j.resconrec.2018.01.026>
- Malinauskaitė, J., Jouhara, H., Czajczyńska, D., Stanchev, P., Katsou, E., Rostkowski, P., ... Spencer, N. (2017). Municipal solid waste management and waste-to-energy in the context of a circular economy and energy recycling in Europe. *Energy*, 141, 2013–2044. <https://doi.org/10.1016/j.energy.2017.11.128>
- Marconi, M., Germani, M., Mandolini, M., & Favi, C. (2019). Applying data mining technique to disassembly sequence planning: a method to assess effective disassembly time of industrial products. *International Journal of Production Research*, 57(2), 599–623. <https://doi.org/10.1080/00207543.2018.1472404>
- Millar, N., McLaughlin, E., & Börger, T. (2019). The circular economy: Swings and roundabouts? *Ecological Economics*, 158, 11–19. <https://doi.org/10.1016/j.ecolecon.2018.12.012>
- Moktadir, A., Rahman, T., Rahman, H., Ali, S. M., & Paul, S. K. (2017). Drivers to sustainable manufacturing practices and circular economy: A perspective of leather industries in Bangladesh. *Journal of Cleaner Production*, 174, 1366–1380.
- Moktadir, M. A., Ahmadi, H. B., Sultana, R., Zohra, F.-T., Liou, J. J. H., & Rezaei, J. (2020). Circular economy practices in the leather industry: A practical step towards sustainable development. *Journal of Cleaner Production*, 251, 119737. <https://doi.org/10.1016/j.jclepro.2019.119737>
- Moktadir, M. A., Ali, S. M., Jabbour, C. J. C., Paul, A., Ahmed, S., Sultana, R., & Rahman, T. (2019). Key factors for energy-efficient supply chains: Implications for energy policy in emerging economies. *Energy*, 189, 116129. <https://doi.org/10.1016/j.energy.2019.116129>
- Moktadir, M. A., Ali, S. M., Kusi-Sarpong, S., & Shaikh, M. A. A. (2018). Assessing challenges for implementing Industry 4.0: Implications for process safety and environmental protection. *Process Safety and Environmental Protection*, 117, 730–741. <https://doi.org/10.1016/j.psep.2018.04.020>
- Moktadir, M. A., Ali, S. M., Rajesh, R., & Paul, S. K. (2018). Modeling the interrelationships among barriers to sustainable supply chain management in leather industry. *Journal of Cleaner Production*, 181, 631–651. <https://doi.org/10.1016/j.jclepro.2018.01.245>
- Morrissey, L., Franceschi, R. B., & Ferreira, A. M. (2020). Sustainable collaborative design practices: Circular economy and the new context for a fashion designer. *Adv. Intell. Syst. Comput.*, 970, 90–101.
- Munim, Z. H., Sornn-Friese, H., & Dushenko, M. (2020). Identifying the appropriate governance model for green port management: Applying analytic network process and best-worst methods to ports in the Indian Ocean Rim. *Journal of Cleaner Production*, 268, 122156. <https://doi.org/10.1016/j.jclepro.2020.122156>
- Murray, A., Skene, K., & Haynes, K. (2015). The circular economy: An interdisciplinary exploration of the concept. *Journal of Business Ethics*, 1–18.
- Murray, A., Skene, K., & Haynes, K. (2017). The circular economy: An interdisciplinary exploration of the concept and application in a global context. *Journal of Business Ethics*, 140(3), 369–380. <https://doi.org/10.1007/s10551-015-2693-2>
- Nadeem, S. P., Garza-Reyes, J. A., & Glanville, D. (2018). The challenges of the circular economy. In *Contemporary Issues in Accounting: The Current Developments in Accounting Beyond the Numbers* (pp. 37–60). London: Palgrave Macmillan. https://doi.org/10.1007/978-3-319-91113-7_3
- Nainggolan, D., Pedersen, A. B., Smed, S., Zemo, K. H., Hasler, B., & Termansen, M. (2019). Consumers in a circular economy: Economic analysis of household waste sorting behaviour. *Ecological Economics*, 166, 106402. <https://doi.org/10.1016/j.ecolecon.2019.106402>
- de Oliveira, C. T., Luna, M. M. M., & Campos, L. M. S. (2019). Understanding the Brazilian expanded polystyrene supply chain and its reverse logistics towards circular economy. *Journal of Cleaner Production*, 235, 562–573. <https://doi.org/10.1016/j.jclepro.2019.06.319>
- Paul, A., Moktadir, M. A., & Paul, S. K. (2019). An innovative decision-making framework for evaluating transportation service providers based on sustainable criteria. *International Journal of Production Research*, 1–19.
- Perey, R., Benn, S., Agarwal, R., & Edwards, M. (2018). The place of waste: Changing business value for the circular economy. *Business Strategy and the Environment*, 27(5), 631–642. <https://doi.org/10.1002/bse.2068>
- Pieroni, M. P. P., McAloone, T. C., & Pigosso, D. C. A. (2019). Business model innovation for circular economy and sustainability: A review of approaches. *Journal of Cleaner Production*, 215, 198–216. <https://doi.org/10.1016/j.jclepro.2019.01.036>
- Prieto-Sandoval, V., Jaca, C., & Ormazabal, M. (2018). Towards a consensus on the circular economy. *Journal of Cleaner Production*, 179, 605–615. <https://doi.org/10.1016/j.jclepro.2017.12.224>
- Prieto-Sandoval, V., Ormazabal, M., Jaca, C., & Viles, E. (2018). Key elements in assessing circular economy implementation in small and medium-sized enterprises. *Business Strategy and the Environment*, 27(8), 1525–1534.
- Primc, K., Kalar, B., Slabe-Erker, R., Dominko, M., & Ogorevc, M. (2020). Circular economy configuration indicators in organizational life cycle theory. *Ecological Indicators*, 116, 106532. <https://doi.org/10.1016/j.ecolind.2020.106532>
- Principato, L., Ruini, L., Guidi, M., & Secondi, L. (2019). Adopting the circular economy approach on food loss and waste: The case of Italian pasta production. *Resources, Conservation and Recycling*, 144, 82–89. <https://doi.org/10.1016/j.resconrec.2019.01.025>
- Pringle, T. (2017). *Establishing a circular economy approach for the leather industry*. UK: PhD thesis.
- Qu, S., Guo, Y., Ma, Z., Chen, W.-Q., Liu, J., Liu, G., & Xu, M. (2019). Implications of China's foreign waste ban on the global circular economy. *Resources, Conservation and Recycling*, 144, 252–255. <https://doi.org/10.1016/j.resconrec.2019.01.004>
- Raj, A., sah, B. (2019). Analyzing critical success factors for implementation of drones in the logistics sector using grey-DEMATEL based approach. *Computers & Industrial Engineering*, 138, 106118.
- Rajesh, R. (2020). Exploring the sustainability performances of firms using environmental, social, and governance scores. *Journal of Cleaner Production*, 247, 119600. <https://doi.org/10.1016/j.jclepro.2019.119600>
- Rajesh, R., & Rajendran, C. (2020). Relating environmental, social, and governance scores and sustainability performances of firms: An empirical analysis. *Business Strategy and the Environment*, 29(3), 1247–1267. <https://doi.org/10.1002/bse.2429>
- Rajput, S., & Singh, S. P. (2019). Connecting circular economy and industry 4.0. *International Journal of Information Management*, 49, 98–113. <https://doi.org/10.1016/j.ijinfomgt.2019.03.002>
- Rezaei, J. (2015). Best-worst multi-criteria decision-making method. *Omega*, 53, 49–57. <https://doi.org/10.1016/j.omega.2014.11.009>
- Rezaei, J. (2016). Best-worst multi-criteria decision-making method: Some properties and a linear model. *Omega*, 64, 126–130. <https://doi.org/10.1016/j.omega.2015.12.001>
- Rezaei, J. (2020). A concentration ratio for nonlinear best worst method. *International Journal of Information Technology & Decision Making*, 1–17.
- Rizos, V., Behrens, A., van der Gaast, W., Hofman, E., Ioannou, A., Kafyeke, T., ... Topi, C. (2016). Implementation of circular economy business models by small and medium-sized enterprises (SMEs): Barriers and enablers. *Sustainability (Switzerland)*, 8(11), 1–18.
- de Sadeleer, I., Brattebø, H., & Callewaert, P. (2020). Waste prevention, energy recovery or recycling—Directions for household food waste

- management in light of circular economy policy. *Resources, Conservation and Recycling*, 160, 104908. <https://doi.org/10.1016/j.resconrec.2020.104908>
- Saeed, M., Wolfgang, K., (2019). Drivers of Sustainable Supply Chain Management: Identification and Classification. *Sustainability*, 11(4), 1137. <http://dx.doi.org/10.3390/su11041137>
- Sariatli, F. (2017). Linear economy versus circular economy: A comparative and analyzer study for optimization of economy for sustainability. *Visegrad Journal on Bioeconomy and Sustainable Development*, 6(1), 31–34. <https://doi.org/10.1515/vjbsd-2017-0005>
- Sassanelli, C., Rosa, P., Rocca, R., & Terzi, S. (2019). Circular economy performance assessment methods: A systematic literature review. *Journal of Cleaner Production*, 229, 440–453. <https://doi.org/10.1016/j.jclepro.2019.05.019>
- Sauerwein, M., Doubrovski, E., Balkenende, R., & Bakker, C. (2019). Exploring the potential of additive manufacturing for product design in a circular economy. *Journal of Cleaner Production*, 226, 1138–1149. <https://doi.org/10.1016/j.jclepro.2019.04.108>
- Senthil Kumar, P., & Femina Carolin, C. (2018). Future for circular economy. In *Circular Economy in Textiles and Apparel*, 207–217.
- Sharma, Y. K., Mangla, S. K., Patil, P. P., & Liu, S. (2019). When challenges impede the process. *Management Decision*, 57(4), 995–1017. <http://dx.doi.org/10.1108/md-09-2018-1056>
- Simon, B. (2019). What are the most significant aspects of supporting the circular economy in the plastic industry? *Resources, Conservation and Recycling*, 141, 299–300.
- Singh, P. K., & Sarkar, P. (2020). A framework based on fuzzy Delphi and DEMATEL for sustainable product development: A case of Indian automotive industry. *Journal of Cleaner Production*, 246, 118991. <https://doi.org/10.1016/j.jclepro.2019.118991>
- Singh, R. K., Luthra, S., Mangla, S. K., & Uniyal, S. (2019). Applications of information and communication technology for sustainable growth of SMEs in India food industry. *Resources, Conservation and Recycling*, 147, 10–18. <https://doi.org/10.1016/j.resconrec.2019.04.014>
- Singhal, K., & Singhal, J. (2019). Technology and manufacturing in China before the industrial revolution and glimpses of the future. *Production and Operations Management*, 28, 505–515. <https://doi.org/10.1111/poms.13010>
- de Sousa Jabbour, A. B., Rojas Luiz, J. V., Rojas Luiz, O., Jabbour, C. J. C., Ndubisi, N. O., de Oliveira, J. H., & Junior, F. H. (2019). Circular economy business models and operations management. *Journal of Cleaner Production*, 235, 1525–1539. <https://doi.org/10.1016/j.jclepro.2019.06.349>
- Sousa-Zomer, T. T., Magalhães, L., Zancul, E., & Cauchick-Miguel, P. A. (2018). Exploring the challenges for circular business implementation in manufacturing companies: An empirical investigation of a pay-per-use service provider. *Resources, Conservation and Recycling*, 135, 3–13. <https://doi.org/10.1016/j.resconrec.2017.10.033>
- Su, B., Heshmati, A., Geng, Y., & Yu, X. (2013). A review of the circular economy in China: Moving from rhetoric to implementation. *Journal of Cleaner Production*, 42, 215–227. <https://doi.org/10.1016/j.jclepro.2012.11.020>
- Suárez-Eiroa, B., Fernández, E., Méndez-Martínez, G., & Soto-Oñate, D. (2019). Operational principles of circular economy for sustainable development: Linking theory and practice. *Journal of Cleaner Production*, 214, 952–961. <https://doi.org/10.1016/j.jclepro.2018.12.271>
- Suzanne, E., Absi, N., & Borodin, V. (2020). Towards circular economy in production planning: Challenges and opportunities. *European Journal of Operational Research*, 287, 168–190. <https://doi.org/10.1016/j.ejor.2020.04.043>
- Svensson, N., & Funck, E. K. (2019). Management control in circular economy. Exploring and Theorizing the Adaptation of Management Control to Circular Business Models. *Journal of Cleaner Production*, 233, 390–398.
- Tuni, A., & Rentizelas, A. (2018). An innovative eco-intensity based method for assessing extended supply chain environmental sustainability. *International Journal of Production Economics*, 217, 126–142.
- Tunn, V. S. C., Bocken, N. M. P., van den Hende, E. A., & Schoormans, J. P. L. (2019). Business models for sustainable consumption in the circular economy: An expert study. *Journal of Cleaner Production*, 212, 324–333. <https://doi.org/10.1016/j.jclepro.2018.11.290>
- Ünal, E., & Shao, J. (2019). A taxonomy of circular economy implementation strategies for manufacturing firms: Analysis of 391 cradle-to-cradle products. *Journal of Cleaner Production*, 212, 754–765. <https://doi.org/10.1016/j.jclepro.2018.11.291>
- Wang, F., Wang, J., Ren, J., Li, Z., Nie, X., Tan, R. R., & Jia, X. (2020). Continuous improvement strategies for environmental risk mitigation in chemical plants. *Resources, Conservation and Recycling*, 160, 104885. <https://doi.org/10.1016/j.resconrec.2020.104885>
- Wang, P., Che, F., Fan, S., & Gu, C. (2014). Ownership governance, institutional pressures and circular economy accounting information disclosure. *Chinese Management Studies*, 8(3), 487–501. <https://doi.org/10.1108/CMS-10-2013-0192>
- Wei, J. (2014). Study of strategic enterprise management based on circular economy. In *WIT Transactions on Information and Communication Technologies*, 49, 1417–1420.
- Yadav, G., Luthra, S., Jakhar, S. K., Mangla, S. K., & Rai, D. P. (2020). A framework to overcome sustainable supply chain challenges through solution measures of industry 4.0 and circular economy: An automotive case. *Journal of Cleaner Production*, 254, 120112.
- Yunkai, Z. (2009). A research on reverse logistics and promotion strategy based on circular economy theory. In *2009 GEOLOGY RESOURCE MANAGEMENT AND SUSTAINABLE DEVELOPMENT* (pp. 74–78). Australia: Aussino Academic Publishing House (AAPH).
- Zeqiang, Z., & Wenming, C. (2006). Reverse logistics and the forming of circular economy hypercycle structure. *Environment*, 612–617.
- Zhu, Q. (2016). Institutional pressures and support from industrial zones for motivating sustainable production among Chinese manufacturers. *International Journal of Production Economics*, 181, 402–409. <https://doi.org/10.1016/j.ijpe.2015.11.009>
- Zucchella, A., & Previtali, P. (2018). Circular business models for sustainable development: A "waste is food" restorative ecosystem. *Business Strategy and the Environment*, 28(2), 274–285.

How to cite this article: Muktadir MA, Kumar A, Ali SM, Paul SK, Sultana R, Rezaei J. Critical success factors for a circular economy: Implications for business strategy and the environment. *Bus Strat Env*. 2020;1–25. <https://doi.org/10.1002/bse.2600>

APPENDIX A.

TABLE A1 Company-1: Manager-1 feedback for DEMATEL analysis

Company-1: M1	CSF ₃	CSF ₈	CSF ₉	CSF ₆	CSF ₄	CSF ₅	CSF ₁	CSF ₇	CSF ₂	CSF ₁₀
CSF ₃	0	7	9	2	6	3	5	2	1	3
CSF ₈	2	0	6	3	7	3	6	3	2	4
CSF ₉	1	6	0	4	8	4	7	4	3	5
CSF ₆	5	8	7	0	9	3	7	2	1	4
CSF ₄	3	9	8	4	0	3	6	3	2	5
CSF ₅	2	8	9	3	5	0	8	4	1	3
CSF ₁	4	9	5	3	7	2	0	2	3	2
CSF ₇	4	9	7	2	8	5	6	0	1	2
CSF ₂	1	5	6	3	8	5	9	4	0	6
CSF ₁₀	2	7	8	3	6	4	7	3	1	0

TABLE A2 Company-1: Manager-2 feedback for DEMATEL analysis

Company-1: M2	CSF ₃	CSF ₈	CSF ₉	CSF ₆	CSF ₄	CSF ₅	CSF ₁	CSF ₇	CSF ₂	CSF ₁₀
CSF ₃	0	5	9	4	7	5	8	3	2	5
CSF ₈	5	0	6	2	8	6	9	4	1	3
CSF ₉	1	8	0	6	9	4	7	5	3	2
CSF ₆	2	6	7	0	8	3	8	1	4	5
CSF ₄	1	8	3	9	0	2	7	4	2	3
CSF ₅	3	6	6	5	8	0	9	6	4	2
CSF ₁	4	7	7	3	9	4	0	2	1	3
CSF ₇	2	8	8	5	8	6	7	0	3	2
CSF ₂	3	6	9	5	5	7	9	4	0	3
CSF ₁₀	2	7	6	4	7	5	7	3	4	0

TABLE A3 Company-1: Manager-3 feedback for DEMATEL analysis

Company-1: M3	CSF ₃	CSF ₈	CSF ₉	CSF ₆	CSF ₄	CSF ₅	CSF ₁	CSF ₇	CSF ₂	CSF ₁₀
CSF ₃	0	6	8	3	7	4	9	5	4	7
CSF ₈	7	0	9	5	8	1	7	2	3	4
CSF ₉	4	7	0	6	9	3	6	4	1	3
CSF ₆	6	5	6	0	6	5	9	5	3	2
CSF ₄	4	8	4	4	0	6	7	2	1	4
CSF ₅	2	7	6	6	7	0	6	6	3	2
CSF ₁	3	9	9	2	9	5	0	5	4	6
CSF ₇	4	5	7	7	4	4	5	0	3	2
CSF ₂	6	6	8	5	6	6	4	6	0	1
CSF ₁₀	4	4	5	6	9	5	8	2	1	0

TABLE A4 Company-2: Manager-4 feedback for DEMATEL analysis

Company-2: M4	CSF ₃	CSF ₈	CSF ₉	CSF ₆	CSF ₄	CSF ₅	CSF ₁	CSF ₇	CSF ₂	CSF ₁₀
CSF ₃	0	6	9	4	7	3	8	5	3	2
CSF ₈	1	0	8	3	8	5	7	4	2	4
CSF ₉	3	5	0	6	5	1	5	2	4	5
CSF ₆	2	8	8	0	6	3	8	4	3	6
CSF ₄	1	6	7	2	0	2	9	3	4	3
CSF ₅	4	7	8	3	4	0	7	2	1	2
CSF ₁	2	9	5	4	7	3	0	5	1	3
CSF ₇	3	5	6	5	5	7	6	0	3	4
CSF ₂	5	7	6	6	6	6	5	4	0	5
CSF ₁₀	4	6	7	3	8	5	7	3	5	0

TABLE A5 Company-2: Manager-5 feedback for DEMATEL analysis

Company-2: M5	CSF ₃	CSF ₈	CSF ₉	CSF ₆	CSF ₄	CSF ₅	CSF ₁	CSF ₇	CSF ₂	CSF ₁₀
CSF ₃	0	7	8	4	8	3	8	2	4	5
CSF ₈	1	0	7	3	7	9	7	2	2	3
CSF ₉	2	6	0	4	6	8	9	1	6	1
CSF ₆	5	6	6	0	8	7	5	4	7	2
CSF ₄	2	5	4	6	0	4	7	3	4	4
CSF ₅	4	6	5	5	7	0	6	2	3	2
CSF ₁	2	7	8	7	5	3	0	5	5	3
CSF ₇	1	9	7	4	9	8	4	0	4	4
CSF ₂	3	4	6	5	7	8	6	3	0	6
CSF ₁₀	2	6	9	9	6	9	8	5	5	0

TABLE A6 Company-2: Manager-6 feedback for DEMATEL analysis

Company-2: M6	CSF ₃	CSF ₈	CSF ₉	CSF ₆	CSF ₄	CSF ₅	CSF ₁	CSF ₇	CSF ₂	CSF ₁₀
CSF ₃	0	4	8	4	7	3	8	5	3	2
CSF ₈	3	0	7	4	6	3	7	3	4	3
CSF ₉	1	5	0	3	7	4	6	4	5	5
CSF ₆	2	7	5	0	9	7	8	6	4	3
CSF ₄	5	6	8	2	0	6	9	4	3	4
CSF ₅	3	9	7	4	7	0	7	5	2	6
CSF ₁	4	8	6	5	8	3	0	6	1	3
CSF ₇	2	7	8	6	7	5	9	0	5	4
CSF ₂	1	5	7	3	5	2	4	3	0	4
CSF ₁₀	1	8	9	2	6	4	8	2	4	0

TABLE A7 Company-3: Manager-7 feedback for DEMATEL analysis

Company-3: M7	CSF ₃	CSF ₈	CSF ₉	CSF ₆	CSF ₄	CSF ₅	CSF ₁	CSF ₇	CSF ₂	CSF ₁₀
CSF ₃	0	4	5	5	6	3	4	2	3	2
CSF ₈	2	0	9	2	7	1	6	3	4	4
CSF ₉	5	8	0	3	8	2	7	5	3	3
CSF ₆	4	5	3	0	6	3	9	4	2	4
CSF ₄	3	7	8	5	0	6	7	6	3	6
CSF ₅	2	7	7	4	6	0	4	7	2	3
CSF ₁	3	9	5	7	8	5	0	3	1	2
CSF ₇	4	5	7	8	9	4	7	0	2	4
CSF ₂	3	5	4	7	6	3	8	7	0	5
CSF ₁₀	2	9	8	5	7	8	5	2	5	0

TABLE A8 Company-4: Manager-10 feedback for DEMATEL analysis

Company-4: M10	CSF ₃	CSF ₈	CSF ₉	CSF ₆	CSF ₄	CSF ₅	CSF ₁	CSF ₇	CSF ₂	CSF ₁₀
CSF ₃	0	9	7	4	9	5	9	2	1	2
CSF ₈	2	0	6	2	7	3	5	3	3	1
CSF ₉	3	8	0	4	8	4	3	7	5	3
CSF ₆	5	7	8	0	6	1	5	4	4	4
CSF ₄	4	9	7	6	0	3	7	2	2	7
CSF ₅	6	5	6	4	5	0	7	8	6	8
CSF ₁	3	8	9	5	5	2	0	1	1	4
CSF ₇	7	6	6	4	7	3	7	0	3	3
CSF ₂	3	8	7	2	8	2	5	3	0	2
CSF ₁₀	2	7	5	7	5	1	4	5	4	0

TABLE A9 Company-5: Manager-13 feedback for DEMATEL analysis

Company-5: M13	CSF ₃	CSF ₈	CSF ₉	CSF ₆	CSF ₄	CSF ₅	CSF ₁	CSF ₇	CSF ₂	CSF ₁₀
CSF ₃	0	8	4	1	4	3	6	8	7	4
CSF ₈	3	0	7	3	7	2	7	6	2	2
CSF ₉	2	9	0	2	6	4	5	5	3	4
CSF ₆	5	6	7	0	3	5	7	8	6	5
CSF ₄	6	6	9	4	0	3	9	4	2	5
CSF ₅	5	4	6	3	8	0	6	3	4	7
CSF ₁	3	8	8	2	9	2	0	5	5	6
CSF ₇	5	6	7	3	7	5	5	0	3	7
CSF ₂	3	5	3	1	4	3	7	8	0	6
CSF ₁₀	7	5	5	2	6	2	7	7	2	0

TABLE A10 Identity matrix

Matrix I	CSF ₃	CSF ₈	CSF ₉	CSF ₆	CSF ₄	CSF ₅	CSF ₁	CSF ₇	CSF ₂	CSF ₁₀
CSF ₃	1	0	0	0	0	0	0	0	0	0
CSF ₈	0	1	0	0	0	0	0	0	0	0
CSF ₉	0	0	1	0	0	0	0	0	0	0
CSF ₆	0	0	0	1	0	0	0	0	0	0
CSF ₄	0	0	0	0	1	0	0	0	0	0
CSF ₅	0	0	0	0	0	1	0	0	0	0
CSF ₁	0	0	0	0	0	0	1	0	0	0
CSF ₇	0	0	0	0	0	0	0	1	0	0
CSF ₂	0	0	0	0	0	0	0	0	1	0
CSF ₁₀	0	0	0	0	0	0	0	0	0	1

TABLE A11 (I-P) matrix

(I-P)	CSF ₃	CSF ₈	CSF ₉	CSF ₆	CSF ₄	CSF ₅	CSF ₁	CSF ₇	CSF ₂	CSF ₁₀
CSF ₃	1.0000	-0.1007	-0.1205	-0.0558	-0.1097	-0.0576	-0.1169	-0.0612	-0.0504	-0.0576
CSF ₈	-0.0468	1.0000	-0.1169	-0.0486	-0.1169	-0.0594	-0.1097	-0.0540	-0.0414	-0.0504
CSF ₉	-0.0396	-0.1115	1.0000	-0.0683	-0.1187	-0.0612	-0.0989	-0.0665	-0.0594	-0.0558
CSF ₆	-0.0647	-0.1043	-0.1025	1.0000	-0.1097	-0.0665	-0.1187	-0.0683	-0.0612	-0.0629
CSF ₄	-0.0522	-0.1151	-0.1043	-0.0755	1.0000	-0.0629	-0.1223	-0.0558	-0.0414	-0.0737
CSF ₅	-0.0558	-0.1061	-0.1079	-0.0665	-0.1025	1.0000	-0.1079	-0.0773	-0.0468	-0.0629
CSF ₁	-0.0504	-0.1331	-0.1115	-0.0683	-0.1205	-0.0522	1.0000	-0.0612	-0.0396	-0.0576
CSF ₇	-0.0576	-0.1079	-0.1133	-0.0791	-0.1151	-0.0845	-0.1007	1.0000	-0.0486	-0.0576
CSF ₂	-0.0504	-0.0917	-0.1007	-0.0665	-0.0989	-0.0755	-0.1025	-0.0755	1.0000	-0.0683
CSF ₁₀	-0.0468	-0.1061	-0.1115	-0.0737	-0.1079	-0.0773	-0.1097	-0.0576	-0.0558	1.0000

TABLE A12 Inverse (I-P) matrix

(I-P) ⁻¹	CSF ₃	CSF ₈	CSF ₉	CSF ₆	CSF ₄	CSF ₅	CSF ₁	CSF ₇	CSF ₂	CSF ₁₀
CSF ₃	1.1208	0.3425	0.3571	0.2099	0.3534	0.2064	0.3536	0.2062	0.1639	0.1973
CSF ₈	0.1523	1.2239	0.3263	0.1869	0.3315	0.1913	0.3202	0.1836	0.1431	0.1756
CSF ₉	0.1522	0.3355	1.2331	0.2112	0.3446	0.2006	0.3231	0.2016	0.1643	0.1872
CSF ₆	0.1867	0.3551	0.3515	1.1632	0.3631	0.2206	0.3649	0.2185	0.1781	0.2079
CSF ₄	0.1665	0.3461	0.3350	0.2216	1.2460	0.2061	0.3495	0.1965	0.1522	0.2063
CSF ₅	0.1748	0.3485	0.3481	0.2206	0.3490	1.1534	0.3476	0.2215	0.1616	0.2030
CSF ₁	0.1631	0.3573	0.3375	0.2132	0.3503	0.1948	1.2370	0.1987	0.1489	0.1905
CSF ₇	0.1813	0.3598	0.3623	0.2378	0.3694	0.2375	0.3515	1.1557	0.1679	0.2041
CSF ₂	0.1698	0.3354	0.3412	0.2205	0.3449	0.2238	0.3423	0.2200	1.1167	0.2078
CSF ₁₀	0.1686	0.3524	0.3547	0.2293	0.3573	0.2275	0.3531	0.2066	0.1715	1.1463