



Blockchain Technology and Circular Economy in the environment of Total Productive Maintenance: A Natural Resource-Based View Perspective

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Abstract

Purpose - Total Productive Maintenance (TPM) could act as a practical approach to offer sustainability deliverables in manufacturing firms aligning with the natural resource-based view (NRBV) theory's strategic capabilities: pollution prevention, product stewardship, and sustainable development. Also, the emergence of Blockchain Technology (BCT) and Circular Economy (CE) are proven to deliver sustainable outcomes in the past literature. Therefore, the present research examines the relationship between BCT and CE and TPM's direct and mediation effect through the lens of NRBV theory.

Design/ methodology - The current study proposes a conceptual framework to examine the relationship between BCT, CE, and TPM and validates the framework through the Partial Least Squares Structural Equation Modeling. Responses from 316 Indian manufacturing firms were collected to conduct the analysis.

Findings - The investigation outcomes indicate that BCT positively influences CE and TPM and that TPM has a significant positive impact on CE under the premises of NRBV theory. The results also suggest that TPM partially mediates the relationship between BCT and CE.

Originality - This research fills a gap in the literature by investigating the effect of BCT and TPM on CE within the framework of the NRBV theory. It explores the link between BCT, TPM, and CE under the NRBV theory's strategic capabilities and TPM mediation.

Implications - The positive influence of TPM and BCT on CE could initiate the amalgamation of BCT-TPM, improving the longevity of production equipment and products and speeding up the implementation of CE practices.

25 **Keywords:** Natural Resource-Based View, Blockchain Technology, Total Productive
26 Maintenance, Circular Economy

27 1. Introduction

28 Production equipment is expanding further into the realm of new digital and intelligent progress
29 due to the improvement of present machinery systems and research and development (Chen *et*
30 *al.*, 2020). In natural industrial environments, modern equipment is frequently used to
31 accomplish crucial jobs; when an accident occurs, the repercussions can be rather severe (Chen
32 *et al.*, 2020). Maintenance can potentially reduce the amount of time spent on non-value-adding
33 activities in production by as much as 40%. (Ahuja and Khamba, 2008). Therefore,
34 preventative machine maintenance is crucial for productive manufacturing processes (Wang *et*
35 *al.*, 2021). For more than fifty years, manufacturers have relied on the maintenance
36 management strategy known as total productive maintenance (TPM) to cut down on machine
37 breakdowns and other unplanned halts in production (Ahuja and Khamba, 2008).

38 Modern equipment is often tasked with more demanding manufacturing duties. In this line,
39 significant possibilities for advancing maintenance to a new level have arisen due to Industry
40 4.0 technology and the fast evolution of Cyber-Physical Systems (Albano *et al.*, 2019). Thus,
41 it is essential to make the most of today's technical tools for implementing smart maintenance
42 of complicated equipment to keep it running so it accomplishes its targets (Chen *et al.*, 2020).

43 However, owing to the rapid progress and use of the internet and digital technology after 1995,
44 product maintenance focused on the entire lifespan emerged (Si *et al.*, 2020). A critical
45 component of machine effectiveness is identifying problems and flaws in real-time and sharing
46 that data with other machines. Providing real-time monitoring and data sharing is a critical area
47 in which blockchain technology (BCT) has excelled (Kumar *et al.*, 2020). Stakeholders with a
48 common goal can use BCT to get an insight into the production process, which in turn will lead

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2
3 49 to better quality control and risk mitigation (Lohmer and Lasch, 2020). BCT may be defined
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5
6 50 as “an online, open-source distributed ledger where transactions between different stakeholders
7
8 51 can be recorded and updated simultaneously and in real-time” (Lakhani and Iansiti, 2017).
9
10 52 Manufacturers in a wide variety of fields may put blockchain to use in several ways. Among
11
12 53 them is the use of smart contracts for the exchange of machine data, the authentication of items,
13
14 54 and the tracking of production and upkeep (Chang *et al.*, 2019).

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16
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18 55 The unique features of blockchain make it essential for data transparency, sharing, and security
19
20 56 in the system's data flow, for which it has become necessary (Javaid *et al.*, 2021). BCT is used
21
22 57 to build a life-cycle information management framework for advanced machinery (Chen *et al.*,
23
24 58 2020). BCT helps to map physical equipment and virtual digital simulations and then carry
25
26 59 out state monitoring, fault detection, and life prediction of complex equipment, which allows
27
28 60 more effective operations and maintenance of the machinery (Chen *et al.*, 2020). Therefore,
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30 61 implementing BCT (especially at the shop floor level) may enhance the outcomes of
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32 62 maintenance management approaches, such as TPM practices. Still, no empirical evidence is
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34
35 63 available in the literature confirming the relationship between BCT and TPM. To address this
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38 64 gap and contribute to the fields of TPM and BCT, the present study addresses the following
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41 65 research question:

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43
44 66 *RQ1: What is the relationship between BCT and TPM in the context of manufacturing firms?*

45
46 67 Simultaneously, the hazards to human survival posed by climate change, biodiversity loss, and
47
48 68 the exhaustion of scarce resources are growing in severity (Köhler *et al.*, 2019). In recent years,
49
50 69 circular economy (CE) has emerged as a practical solution for mitigating the risks associated
51
52 70 with these concerns (Prieto-Sandoval *et al.*, 2018). The end goal of CE is to move away from
53
54 71 the linear economic model that is prevalent today and toward a closed-loop economy that uses
55
56 72 resource regeneration and ecological restoration as its primary pillars (Murray *et al.*, 2017). In
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1
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3 73 light of this, there has been a rise in the amount of interest in blockchain technology among
4
5 74 both academics and industry professionals as a potential accelerant for the transition to an
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7 75 economy based on CE (Böhmecke-Schwafert *et al.*, 2022). There is a plethora of information
8
9 76 to be gleaned from products in use, particularly those that are both durable and capital-intensive
10
11 77 (Kärkkäinen *et al.*, 2003a). The use of blockchain in environmental sustainability has been
12
13 78 investigated in recent research using a variety of perspectives, including supply chain
14
15 79 sustainability, product-service systems, product deletion, and ecological sustainability
16
17 80 (Agrawal *et al.*, 2021). According to more current study findings, the three CE principles of
18
19 81 reducing, reusing, and recycling have recently been supported by BCT (Venkatesh *et al.*, 2020).
20
21 82 By delivering correct information, blockchain-based supply chain management solutions may
22
23 83 improve traceability in complicated supply chains and encourage consumers to make more
24
25 84 responsible purchasing decisions. Using intelligent contracts, blockchain can assist in waste
26
27 85 management by facilitating trade and recycling initiatives (Khadke *et al.*, 2021). In addition to
28
29 86 energy trading platforms and source verification systems, BCT may aid in utilising renewable
30
31 87 energies by facilitating peer-to-peer transactions in energy (Yildizbasi, 2021). It is possible to
32
33 88 use blockchain to create and manage new CE chains (Narayan and Tidström, 2020). Therefore,
34
35 89 it is possible that the implementation of BCT in the supply chain of manufacturing firms could
36
37 90 lead to CE practices. Also, recent literature published by Samadhiya *et al.* (2022) emphasises
38
39 91 investigating the role of BCT in CE. Still, empirical evidence related to this relationship is
40
41 92 lacking in the literature, which leads to the formulation of a second research question to address
42
43 93 this gap:

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45 94 *RQ2: What is the relationship between BCT and CE in the context of manufacturing firms?*

46
47 95 To achieve harmonious and sustainable growth, CE proposes organisations optimise resource
48
49 96 consumption and minimise waste to achieve success (Ghisellini *et al.*, 2016). As the cost of
50
51 97 raw materials and end-of-life treatment rises, maintenance is becoming a more enticing way to

1
2
3 98 start CE and move to a more sustainable route (Allen, 2021). Implementing TPM in a
4
5 99 manufacturing firm delivers production-related commitments by preventing machine
6
7
8 100 breakdowns (Ahuja and Khamba, 2008). However, to offer operational excellence, TPM
9
10 101 reduces waste and toxicants through its implementation (Vukadinovic *et al.*, 2018), as it is the
11
12 102 most crucial concept of lean manufacturing (Thanki *et al.*, 2016). The philosophy of TPM
13
14 103 practices is based on the optimum consumption of resources to deliver ecological-oriented
15
16 104 outcomes (Wudhikarn, 2012). Past studies indicate that TPM leads to greener production and
17
18 105 better environmental performance (Amjad *et al.*, 2021). Green and cleaner production are
19
20 106 indicators of CE practices (Ghisellini *et al.*, 2016). Therefore, for these two indicators (green
21
22 107 and cleaner production), TPM is a feasible approach to leading CE outcomes. Also, TPM helps
23
24 108 improve equipment's longer life span through preventive maintenance (Farrukh *et al.*, 2019),
25
26 109 which is also one of the CE targets. Nevertheless, no previous studies have focused on
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31 110 empirically exploring the relationship between TPM and CE. This led to the third research
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33 111 question of this study as follows:

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36 112 *RQ3: What is the relationship between TPM and CE in the context of manufacturing firms?*

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38
39 113 The previous discussion indicates that the implementation of BCT, TPM, and CE in a firm can
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41 114 address issues related to pollution prevention, product stewardship, and sustainable
42
43 115 development. The most suitable theory to underpin the present study is the natural resource-
44
45 116 based view (NRBV) theory, which suggests that companies that are too devoted to a single set
46
47 117 of resources may have problems acquiring new resources or competencies (Hart, 1995).

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51 118 Therefore, the present research considers BCT, TPM, and CE as natural resources for
52
53 119 companies to address their NRBV strategic capabilities. Although some past studies have used
54
55 120 the NRBV theory as a lens for their investigations (Shahzad *et al.*, 2020; Huang *et al.*, 2021),
56
57 121 no studies have investigated the relationship between BCT, TPM, and CE through the lens of
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1
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3 122 the NRBV theory. Therefore, the present study has used NRBV theory as a theoretical
4
5 123 foundation to investigate the relationship between BCT, TPM, and CE in manufacturing firms.

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8 124 Further, to address the research questions (stated above), the current research develops a
9
10 125 theoretical framework that hypothesises the relationship between BCT, TPM, and CE. The
11
12 126 framework is then validated through an empirical study using Partial Least Squares Structural
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14 127 Equation Modeling (PLS-SEM) as an empirical tool.

18 128 **2. Theoretical background, hypothesis formulation, and conceptual framework**

21 129 **2.1 NRBV theory**

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24 130 The NRBV is a well-known theory in academic circles, having particular importance in
25
26 131 sustainable operations (Marshall *et al.*, 2015). NRBV examines a variety of new approaches to
27
28 132 problem-solving that organisations might use to address environmental concerns (Alt *et al.*,
29
30 133 2015). The three critical strategic capabilities that define the NRBV theory are pollution
31
32 134 prevention, product stewardship, and sustainable development (Hart, 1995). Pollution
33
34 135 prevention aims to cut down on the amount of waste generated throughout the production
35
36 136 process, both operationally and environmentally. In addition to reducing the consumption of
37
38 137 toxic substances and resources, product stewardship aims to include ecologically friendly
39
40 138 design features in goods and operations (Hart *et al.*, 2010). The focus of sustainable
41
42 139 development is on resource efficiency from the viewpoint of long-term ecological and
43
44 140 economic sustainability, as well as personnel and ecological wellness and protection
45
46 141 (Baumgartner and Raute, 2010).

47
48
49 142 Global supply networks are becoming more sustainable with the application of BCT (Saber *et*
50
51 143 *al.*, 2019). Also, a company's environmental sustainability may be impacted by BCT in various
52
53 144 ways (Gong and Zhao, 2020). Blockchain advocates consider that its appropriate application
54
55 145 may help reduce carbon emissions, particularly at the corporate level (Kouhizadeh and Sarkis,

1
2
3 146 2018). Sabri *et al.* (2018) believe that BCT will lead to new methods of producing
4
5 147 environmentally friendly goods. Also, real-time environmental data may be monitored and
6
7 148 stored via blockchain to allow for rapid choices on carbon footprints (Sabri *et al.*, 2018).
8
9 149 Therefore, BCT could be recognised as a new organisational resource to address the strategic
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11 150 capabilities of NRBV theory.

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15 151 To fit in the lens of NRBV, it is common to practice in CE to recycle materials periodically
16
17 152 and at a high rate of return (Ellen MacArthur Foundation, 2012). CE incorporates economic,
18
19 153 environmental, and social considerations into a company's operations to turn society into a
20
21 154 more sustainable one (Dey *et al.*, 2020). CE offers an economical system that represents a
22
23 155 paradigm change in how humanity relates to the environment to reduce resource scarcity, break
24
25 156 materials and energy cycles, and promote sustainable development (Geissdoerfer *et al.*, 2017).
26
27 157 Mishra *et al.* (2019) suggest CE as a firm resource to address the strategic capabilities of NRBV
28
29 158 perception. Therefore, CE could be an organisational asset that can handle the NRBV's
30
31 159 strategic capabilities.

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36 160 TPM has also been a practical maintenance management approach adapted by manufacturing
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38 161 firms to reduce waste while preventing machine breakdowns and offering smooth operations
39
40 162 (Chiarini, 2014). Farrukh *et al.* (2022) indicate TPM as a green lean six sigma practice, which
41
42 163 can address the three strategic capabilities of NRBV theory. Also, TPM is a constructive lean
43
44 164 philosophy to overcome issues such as spending colossal resources on maintenance for
45
46 165 implementing CE effectively (Basten and Houtum, 2014) to offer the longevity of the materials
47
48 166 and prevent the end of the product life cycle (Batista *et al.*, 2019). TPM has been an effective
49
50 167 strategy for improving economic performance (Hooi and Leong, 2017), environmental
51
52 168 performance (Garza-Reyes *et al.*, 2018), and social performance (Piercy and Rich, 2015) in
53
54 169 manufacturing firms. Therefore, TPM can also be considered a practical natural resource for a
55
56 170 firm to address the NRBV's strategic capabilities.

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3 171 This way, TPM, CE, and BCT have the potential to become firm assets under the premises of
4
5 172 NRBV theory. Nevertheless, minimal research has been conducted in this domain, or the
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8 173 conducted research has taken an individual dimension with NRBV theory.
9

10 174 **2.2 Hypothesis formulation and conceptual research framework**

11 175 **2.2.1 BCT and TPM**

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16 176 In this era of mechanisation, maintenance is an essential tool to offer production-related
17
18 177 commitments. TPM is a frequently implemented machine maintenance strategy in the
19
20 178 manufacturing sector to minimise losses in production operations, extend machinery lifespan,
21
22 179 and ensure machinery's efficient exploitation (Nallusamy and Majumdar, 2017). Predictive and
23
24 180 preventive maintenance procedures may be orchestrated using blockchain as part of a more
25
26 181 considerable Industrial Internet of Things (IIoT) plan (Stackpole, 2019). BCT is based on a
27
28 182 decentralised control network. More advanced manufacturing service needs may be handled
29
30 183 by gateways that process higher-level types of manufacturing service demands with a more
31
32 184 excellent processing capability when using a decentralised control framework (Leng *et al.*,
33
34 185 2020a). BCT enables the digitalisation of systems for monitoring and tracing by providing real-
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36 186 time data.
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43 187 The aspect of maintenance has been entirely reimagined (Karki *et al.*, 2022) as a result of recent
44
45 188 developments in data and analytics technology and the introduction of IIOT (Paschou *et al.*,
46
47 189 2020). The digitalisation of maintenance today has the power to leverage information and
48
49 190 intricate analytics to forecast, detect, diagnose, and rectify equipment issues, and be a durable
50
51 191 and essential component to achieving numerous company goals, including revenue (Karki and
52
53 192 Porras, 2021). Digitalisation also has other advantages such as a better understanding of the
54
55 193 data and the ability to foresee and fix problems as well as optimise the system and modernise
56
57 194 it (Karki and Porras, 2021). Revamping maintenance via digitalisation is one of the most
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3 195 significant ways to do so, allowing the development of new cutting-edge solutions that make
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5
6 196 businesses more efficient, productive, and durable in maintenance (Karki *et al.*, 2022). BCT
7
8 197 offers real-time data, and maintenance companies can compete better, reduce unnecessary
9
10 198 downtime, and optimise equipment availability and production schedules using real-time data.
11
12 199 Real-time data may be used to enhance maintenance operations irrespective of the sector
13
14 200 (Smith, n.d.). Failover data from several sources may be collected in real-time when equipment
15
16 201 fails, automatic repair solutions are available and operators may be notified if they are needed
17
18 202 (O'Brien, n.d.). With the help of real-time monitoring, as operational circumstances begin to
19
20
21 203 deviate from the manufacturer's specifications, sensors begin reporting back, allowing
22
23 204 manufacturers to forecast failure precisely (O'Brien, n.d.). Therefore, the implementation of
24
25 205 BCT can improve the performance of maintenance management practices, such as TPM by
26
27 206 offering real-time data, which will help to maintain the longevity of production equipment. In
28
29 207 this manner, machine longevity and real-time monitoring of TPM practices will reduce waste
30
31 208 and promote better sustainable growth. The results of this relationship (BCT and TPM) will be
32
33 209 aligned with the objectives of the NRBV theory. However, no past studies have examined the
34
35 210 relationship between BCT and TPM in the context of the NRBV theory. Thus, we hypothesise
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37 211 that,

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43 212 *H1: BCT has a significant favourable influence on TPM from the perception of the NRBV*
44
45 213 *theory.*

46 47 48 214 **2.2.2 BCT and CE**

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51 215 CE's growing significance has identified optimal commodity use within the bounds of
52
53 216 monetary development and environmental conservation as a priority (Morseletto, 2020).
54
55 217 Although blockchain has been hailed as a facilitator of CE via its use in the three primary
56
57 218 domains of reuse, reduce, and recycle (3Rs), existing studies are primarily theoretical
58
59
60

219 (Upadhyay *et al.*, 2021a). Upadhyay *et al.* (2021b) suggested that BCT may lower processing
220 expenses and carbon emissions and enhance the CE's operational efficiency and connectivity.
221 Moreover, material and item movements may be tracked accurately using blockchain-based
222 supply chains while waste management tools can facilitate effective recycling and repurposing
223 of materials (Böhmecke-Schwafert *et al.*, 2022). In order to facilitate the sharing of information
224 about products individuals across their entire existence, the idea of “product-centric
225 information management” was created (Kärkkäinen *et al.*, 2003b; Tang & Qian, 2008; Meyer
226 *et al.*, 2009).

227 Circular supply chain (CSC) operations, commodities, natural resources, goods, and activities
228 are highly impacted by the features of blockchain such as transparency, traceability, security,
229 dependability, actual-time information, and smart contracts (Khan *et al.*, 2021). Through
230 blockchain, the data is continually available to CSC stakeholders, improving their ability to
231 collaborate both inside the company and with outside parties since a CE demands the creation
232 of workable loops at multiple points along the supply chain (Nandi *et al.*, 2021). Additionally,
233 because of the blockchain's high level of traceability, fewer items and resources are thrown out
234 during CSC operations (Kayikci *et al.*, 2022). The previous discussion indicates that the
235 implementation of BCT will enhance the performance of CE in terms of offering pollution
236 prevention (through achieving 3Rs), a better environment (through optimal use of resources),
237 and sustainable development (offering sustainable-oriented outcomes). The outcomes of the
238 impact of BCT on CE are aligned with the three strategic capabilities of NRBV theory. Still,
239 no research has been conducted in this context. This leads us to the following hypothesis-

240 *H2: BCT has a significant positive influence on CE from the perception of the NRBV theory.*

241

242

243 2.2.3 TPM and CE

244 The Ellen MacArthur Foundation, a significant stakeholder in the circular revolution, has
245 defined CE as a fresh approach to developing, manufacturing, and consuming products within
246 ecological limits (Jain, 2021). Instead of providing a general framework for economic activity,
247 CE identifies particular areas where new value may be created and how that value might be
248 captured (European Union Publication, 2013). In a CE, waste and pollution are eliminated,
249 goods and resources are recycled, and nature is regenerated.

250 The butterfly diagram offered by the Ellen MacArthur Foundation (n.d.), also known as the CE
251 system diagram, depicts the continual movement of commodities in the economy. The butterfly
252 diagram shows the importance of maintenance operations by emphasising that these activities
253 minimise systematic leakages and negative externalities (Ellen MacArthur Foundation, n. d.).
254 When it comes to implementing CE and the pursuit of strategically focused goals, maintenance
255 plays a significant role (Valkokari *et al.*, 2017). The TPM approach systematically analyses
256 production systems to integrate regularly planned maintenance into conventional business
257 operations (Encapera *et al.*, 2019). TPM can cut down other wastes or components that do not
258 add value due to its efficient use of its resources and the preventative maintenance procedures
259 it employs (Heravi *et al.*, 2019). TPM techniques may help generate production that is both
260 more efficient and less harmful to the environment (Amjad *et al.*, 2021). TPM is a powerful
261 maintenance technique that may help cut power usage and eliminate leaks and waste by
262 avoiding process breakdowns (Chiarini, 2014). Therefore, the maintenance deliverables in the
263 butterfly diagram and other past studies discussed in this section lead to the possibility of a
264 positive influence of TPM on CE implementation in a firm. The positive impact of TPM on CE
265 could lead to environmental outcomes and sustainable development (through minimising waste
266 and reducing ecological burden), aligning with the NRBV theory's objectives. The discussion

267 develops a need to investigate the relationship between TPM and CE in the context of the
268 NRBV theory. Thus, we hypothesise that,

269 *H3: TPM has a significant favourable influence on CE from the perception of the NRBV theory.*

270 TPM can reduce the amount of energy used and the amount of carbon dioxide emitted by the
271 production system because of its efficient resource management and preventative maintenance
272 practises, which in turn helps firms improve their environmental performance (Chiarini, 2014).
273 Maintenance data loses its value without an effective tracking mechanism for all parts, resulting
274 in less precise estimates of key metrics like reliability (Mohril *et al.*, 2022). A technique that
275 can reliably guarantee traceability is necessary for a complete maintenance management
276 programme (Mohril *et al.*, 2022). With the assistance of BCT, improvements in the
277 maintenance system's ability to foresee breaks, losses, and wastes might be made (Smith, n.d.).
278 In addition to this, it will lengthen the machine's lifespan and contribute to the delivery of
279 improved environmental results. The many stages of a product's life cycle—from conception
280 to retirement—are streamlined by using BCT (Leng *et al.*, 2020b). Furthermore, with all these
281 efforts, supply chains of manufacturing firms could be more aligned towards a circular rather
282 than a linear model. Therefore, it is possible to state, in a straightforward manner, that the
283 incorporation of BCT into TPM has the potential to enhance the performance of CE. This
284 argument leads to the possible mediation effect of TPM on the relationship between BCT and
285 CE. No previous research has investigated the effect of TPM in this particular manner. Thus,
286 we hypothesise that,

287 *H4: TPM has a significant mediating influence on the relationship between BCT and CE.*

288

289

290

291 2.2.4 Conceptual research framework

292 Figure 1 presents the theoretical research framework which illustrates the proposed relationship
293 between BCT and CE and the direct and mediation effect of TPM from the NRBV theory
294 perspective. Also, it constitutes the foundation for the present empirical study.

295 *“Insert Figure 1 here”*

296 3. Research methodology

297 In the present research, a research framework (Figure 1) is proposed and validated by the
298 quantitative tool (Partial Least Squares Structural Equation Modeling (PLS-SEM) analysis).

299 The methodology of reporting the PLS-SEM has been adopted by recent studies, e.g. Jahed *et*
300 *al.* (2022) and Wang *et al.* (2022).

301 3.1 Questionnaire development

302 The majority of the measures for the BCT, TPM, and CE constructs were adopted from
303 previously published research and adapted to meet the study's criteria. The structure and
304 content of the questionnaire instrument were refined using a three-step process (Ramkumar
305 and Jenamani, 2015). The survey's language and clarity were first reviewed by ten academics
306 from India's top business schools. Together, they had more than a decade's worth of experience
307 in the field. The survey data was then reviewed by a panel of ten industrial manufacturing
308 experts to confirm the results' accuracy. The indicators' content was subsequently refined and
309 validated using pilot surveys with 20 managers from a range of manufacturing firms. For
310 measurement, a five-point Likert scale was used, which was interpreted as follows by the
311 respondents:

- 312 • 1= strongly disagree, 2= disagree, 3= neutral, 4= agree, and 5= strongly agree

1
2
3 313 Table 1 illustrates the items adopted from the literature to define the constructs for the present
4
5 314 study.

6
7
8 315 *"Insert Table 1 here"*

11 316 **3.2 Data collection**

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13
14 317 The manufacturing sector of India was the focus of the research. The Centre for Monitoring
15
16 318 Indian Economy (CMIE) ProwessIQ database was used to obtain a list of licenced businesses
17
18 319 that could be contacted to participate in the research. Between December 2021 and June 2022,
19
20 320 783 manufacturing companies were contacted. The COVID-19 pandemic made it more
21
22 321 challenging to collect data, especially during on-site assessments. As a result, a number of
23
24 322 different channels of electronic communication with businesses were set up. In the end, 316
25
26 323 respondents answered the survey after multiple follow-up emails. The demographic
27
28 324 information of the respondents and their companies is shown in Table 2 and Table 3.

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32
33 325 *"Insert Table 2 here"*

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35
36 326 *"Insert Table 3 here"*

39 327 **3.3 Analytical approach**

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41
42 328 The data was analysed using the Partial Least Squares and Structural Equation Modelling (PLS-
43
44 329 SEM) technique. Based on the SEM approach, the CB-SEM and the PLS-SEM both make it
45
46 330 possible to examine the structural links between the latent variables (Cao *et al.*, 2021).
47
48 331 However, both methods of SEM use different computing processes, make different predictions,
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50 332 and evaluate the structural model's fit in different ways (Hair Jr *et al.*, 2014). With a smaller
51
52 333 sample size, PLS-SEM may compute complicated models with several constructs linked to
53
54 334 numerous variables (Hair *et al.*, 2016). Although population heterogeneity resulted due to data
55
56 335 collected from different sectors, this was handled by employing a situationally based equality

336 assumption (Rigdon, 2016), which allowed for a reduced sample size to be used while still
337 achieving a statistically significant result (Hair *et al.*, 2018). Taking into account the needs of
338 the complicated model and the lack of heterogeneity, the Peng and Lai (2012) "10-times" rule
339 of thumb was used for determining the sample size. There were enough completed surveys
340 (316) to meet the required minimum sample size.

341 4. Results

342 In the process of this research, the SmartPLS 3.0 software (Ringle *et al.*, 2015) was used for
343 both the assessment of the framework and the approximation of the interior. In addition to this,
344 the measurement and structural model were used to evaluate the PLS-SEM.

345 4.1 Evaluation of measurement model

346 The current research used the criteria proposed by Hair *et al.* (2016) to assess the measurement
347 models' validity and reliability. First, the study computed the values of the Composite
348 reliability (CR) and Chronbach alpha (CA) to determine how reliable the constructs were, and
349 then their validity was evaluated. According to Hair *et al.* (2016), a value of 0.70 for CA and
350 CR is the cutoff point for determining whether or not a construct has high levels of internal
351 consistency. According to the findings presented in Table 4, all of the constructs had values
352 higher than 0.70 in this category. In addition, the investigation looked at the values of factor
353 loading to determine whether they were sufficient to ensure dependability. According to the
354 present research findings, each item has a factor loading greater than 0.70, demonstrating
355 strong indicator reliability.

356 *"Insert Table 4 here"*

357 In order to determine whether or not the constructs were reliable, the study followed the
358 recommendations of Black and Babin (2019) and hence used a two-fold method. It investigates
359 both the discriminant and the convergent validity of the hypotheses. The value of a construct's

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3 360 Average variance extracted (AVE) must be greater than 0.50 for the construct to be considered
4
5
6 361 convergent valid (Hair *et al.*, 2016). The findings of the AVE are shown in Table 4, which
7
8 362 shows that the values of every construct were greater than 0.50. As a result, each construct was
9
10 363 considered to have convergent validity. The present research used the heterotrait-monotrait
11
12 364 ratio of correlations (HTMT) criterion to test discriminant validity. The findings are presented
13
14 365 in Table 5. Henseler *et al.* (2015) suggest that the HTMT criteria' cut-off value should be less
15
16 366 than 0.9. The results from Table 5 indicate that the research also fulfilled the requirements for
17
18
19 367 discriminant validity.

20
21
22 368 *“Insert Table 5 here”*

23 24 25 369 **4.2 Common method bias (CMB)**

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27
28 370 The responses to the survey were completely anonymous and kept strictly confidential.
29
30 371 Everyone who participated was made aware that their responses would be anonymous.
31
32 372 However, in surveys based on questionnaires, there is always the possibility of common
33
34 373 method variation and bias, which may hinder the reliability and validity of the empirical results
35
36 374 (Baumgartner and Steenkamp, 2001).

37
38
39
40 375 Harmen's one-factor test was utilised to undertake a post-hoc analysis of the study's findings.
41
42 376 Principal axis factoring was used to extract the data, and the results showed that 40.176% of
43
44 377 the variation could be explained. According to Podsakoff *et al.* (2003), the cut-off value should
45
46 378 be less than 50%. Therefore, CMB was not likely to be a problem in this research. Still, the
47
48 379 present study conducted one more test to cross-check the possibility of CMB. The study used
49
50 380 the variance inflation factor (VIF) as a collinearity test to examine the possibility of CMB in
51
52 381 this case. The findings of Hair *et al.* (2019) suggest that the threshold value of VIF should be
53
54 382 less than 3 for lower CMB. The results of VIF are shown in Table 6, which indicates the lower
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56 383 variance (CMB) of this research.
57
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60

384 *“Insert Table 6 here”*

385 **4.3 Evaluation of structural model**

386 After analysing the model’s results, it is possible to get insight into the structural model's ability
387 to make predictions for one or even more proposed constructs. The research used a method
388 known as nonparametric bootstrapping, using 5000 subsamples to assess the estimate's
389 accuracy. Standardised root mean square (SRMR) values were used to evaluate the model's
390 fitness. These values must be below 0.08 (Cho *et al.*, 2020) for a population of more than one
391 hundred in a study (Cho *et al.*, 2020) (Here, it is 316). Table 6 shows that the SRMR value for
392 the current research was 0.053, which is smaller than 0.08. Consequently, the results of the
393 SRMR values suggested that the model was well-fit. In addition to this, the values of R² and
394 Q² are shown in Table 7. The cutoff value for R² should be greater than 0.1 (Hair *et al.*, 2016).
395 Additionally, the values of Q² have to be more than zero (Falk and Miller, 1992). According to
396 the findings included in Table 7, the model had reached a level of predictive relevance.

397 *“Insert Table 7 here”*

398 In order to establish the statistical significance of pathways and acceptance of the hypotheses,
399 the value of various standard coefficients, such as β , must be greater than zero, and the p-value
400 must be less than 0.05. All of the assumptions presented in this research were shown to be valid
401 based on the findings presented in Table 8 and Figure 2.

402 *“Insert Table 8 here”*

403 *“Insert Figure 2 here”*

404 Table 8 indicates that all the hypotheses have been accepted. In order to get a clear
405 understanding of the direct influence that the study design had on the various components, a
406 mediation impact assessment was carried out (Ramkumar and Jenamani, 2015). The

1
2
3 407 assessment was contingent on the fulfilment of the following prerequisites, i.e. (1) the direct
4
5 408 connection without mediation influence should be statistically significant; (2) the indirect
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7 409 influence after mediation ought to be statistically meaningful; and (3) if the variance accounted
8
9 410 for (VAF) exceeds 80%, it symbolises a complete mediation effect; $20\% < \text{VAF} < 80\%$ means
10
11 411 partial mediation, and less than 20% VAF value indicates that there is no mediation effect.

12
13
14
15 412 The mediation effect analysis revealed the existence of major and statistically significant
16
17 413 mediating channels. In this case, there was a statistically significant relationship between the
18
19 414 presence of partial mediation and the existence of mediation effects, which are represented by
20
21 415 the routes $\text{BCT} \rightarrow \text{TPM} \rightarrow \text{CE}$ ($\beta = 0.140$, $T = 3.579$, and $\text{VAF} = 27.13\%$).

22 23 24 25 416 **5. Discussion and implications**

26 27 28 417 **5.1 Discussion of findings**

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30
31 418 This study investigates how TPM, BCT, and CE are related within the premises of the three
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33 419 strategic capabilities of the NRBV theory. PLS-SEM was used to verify the conceptual research
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35 420 framework (see Figure 2 and Table 8). The findings suggest a high positive correlation between
36
37 421 BCT to TPM and CE and TPM and CE. Table 8 and Figure 2 also show that TPM partially
38
39 422 mediates the link between BCT and CE.

40
41
42
43 423 Concerning the first hypothesis (H1), the standard coefficient values ($\beta = 0.508$, $T = 8.225$, and
44
45 424 $p < 0.00$) indicate that BCT has a substantial beneficial impact on TPM. The results are
46
47 425 consistent with earlier research (Karki *et al.*, 2022; O'Brien, n.d.; Smith, n.d.). According to
48
49 426 H1, adopting BCT may increase TPM performance by monitoring real-time data, resulting in
50
51 427 greater waste reduction and optimal resource usage. Furthermore, the optimality of input and
52
53 428 output resources at the shop floor level will lead to pro-environmental behaviours. Under the
54
55 429 NRBV theory, H1 suggests that BCT has a substantial positive association with TPM.

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2
3 430 The values of standard coefficients ($\beta= 0.376$, $T= 5.175$, and $p< 0.00$) support the second
4
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6 431 hypothesis (H2), which states that BCT has a substantial positive effect on CE. Prior
7
8 432 investigations, such as those of Böhmecke-Schwafert *et al.* (2022), Upadhyay *et al.* (2021a),
9
10 433 Upadhyay *et al.* (2021b), and Nandi *et al.* (2021), have shown similar results. This research
11
12 434 empirically validates these previous studies as most of them were of a theoretical nature only.
13
14 435 The results also show that adopting BCT aids in the tracking of non-value-added resources
15
16 436 throughout the CSC. Traceability also aids in the achievement of the CE's 3Rs aim. As a result,
17
18 437 the application of BCT in the supply chain promotes CE practices under the NRBV paradigm.
19
20
21
22 438 The results of the standard coefficients ($\beta= 0.276$, $T= 4.068$, and $p< 0.00$) support the third
23
24 439 hypothesis (H3), indicating that TPM has a considerable beneficial impact on CE practises.
25
26 440 Some previous investigations, such as those conducted by the Ellen MacArthur Foundation
27
28 441 (n.d.), Amjad *et al.* (2021), and Heravi *et al.* (2019), align with H3's findings. Although
29
30 442 previous research does not immediately correlate with H3, it suggests that H3 is possible. The
31
32 443 results have now been empirically validated, providing a solid basis for this approach. The
33
34 444 TPM's preventative maintenance method helps to reduce a variety of wastes. It also aids in the
35
36 445 reduction of several hazardous pollutants and the extension of production equipment life. As a
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38 446 result, the impact of TPM on CE could offer outcomes within the premises of the NRBV
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40
41 447 conception.
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45
46 448 The PLS-SEM analysis shows that 27.13% of the overall effect size supports the partial
47
48 449 mediation of TPM on the BCT and CE relationship. The data show that BCT has a positive
49
50 450 causal connection with CE (Böhmecke-Schwafert *et al.*, 2022; Upadhyay *et al.*, 2021a;
51
52 451 Upadhyay *et al.*, 2021b) and is partly mediated by TPM. Finally, the values of R^2 (greater than
53
54 452 0.1) and Q^2 (greater than 0) for all the constructs demonstrate that the study is both strong and
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56
57 453 robust.
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5.2 Theoretical implications

The primary objective of the present research was to address the research question: "How are BCT, TPM, and CE connected within the premises of the NRBV theory, particularly in the context of three strategic capabilities supplied by NRBV theory as described by Hart (1995)?".

Past studies have examined or indicated the possible correlations between BCT and TPM (Karki *et al.*, 2022; O'Brien, n.d.; Smith, n.d.), BCT and CE (Böhmecke-Schwafert *et al.*, 2022; Upadhyay *et al.*, 2021a; Upadhyay *et al.*, 2021b; Nandi *et al.*, 2021), TPM and CE (Ellen MacArthur Foundation (n.d.), Amjad *et al.*, 2021; Heravi *et al.*, 2019). However, all these relationships are examined or proposed individually and in some general context, i.e., without any theoretical foundation. Therefore, this is the first study that examines the relationship between BCT, TPM, and CE as a combined effort through the lens of NRBV theory.

The second contribution this study makes to the existing body of the NRBV theory is developing a strong causal link between established (TPM) and establishing (BCT and CE) operations management philosophies. This finding is included in the literature on NRBV theory. The interpretation might be understood to mean that these three philosophies (BCT, TPM, and CE) have the potential to provide the vision of a manufacturing business if the firm is subject to the impact of the NRBV theory.

Third, in terms of the approach, the high sample size (n=316) allows for statistical extrapolation of the findings (Chand *et al.*, 2022). Specifically, the results provide a numerical assessment of the link, revealing the intensity with which the interaction influence was present. The paper makes a theoretical addition to the discussion of how manufacturing organisations might employ the BCT, TPM, and CE to understand their interaction behaviour to produce outcomes with an emphasis on the NRBV theory. In manufacturing companies, our findings provide light on the interplay between BCT, TPM, and CE. Additionally, the research results provide a basis

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2
3 478 for theoretical validation in future studies that are equivalent to the present one, and they do so
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5 479 in the context of a separate industry.

6
7
8 480 Hart (1995) devised the NRBV paradigm, emphasising how firms may differentiate themselves
9
10 481 via contributions to sustainable development. Based on the findings of this study, it appears
11
12 482 that manufacturing companies can gain a competitive edge by implementing BCT, TPM, and
13
14 483 CE due to the positive and causal solid interrelation between these three factors, which in turn
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16 484 encourages the development of sustainability-related aspects within the manufacturing firm,
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18 485 particularly in the areas of pollution prevention, product stewardship, and sustainable growth.
19
20 486 This study not only has theoretical ramifications but also implies that these skills might form
21
22 487 the foundation for manufacturing organisations' capacity to provide a competitive edge.

23 24 25 26 27 488 **5.3 Managerial implications**

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29
30 489 The results of this research have important implications for management's comprehension of
31
32 490 BCT and TPM's impact on CE within the framework of the NRBV theory. By using BCT as
33
34 491 an integrated strategy in TPM, practitioners, managers, and shop floor supervisors may produce
35
36 492 more environmentally friendly results, including less pollution, improved accessibility to
37
38 493 resources, and minimised waste across manufacturing processes. Furthermore, the insight that
39
40 494 BCT has provided into each aspect of maintenance is excellent. This includes allowing product
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42 495 information, linking products to suppliers, commencing yearly maintenance, implementing
43
44 496 service queries, storing service history, and producing invoices (A. R., 2020).

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49 497 From what it can be concluded, TPM practises have been widely adopted by industrial
50
51 498 organisations for decades, and this trend shows no signs of slowing down. However, the study's
52
53 499 empirical research suggests that, in the future, industrial organisations all over the globe, not
54
55 500 only in India, will increasingly use TPM practices in tandem with BCT. Practitioners see TPM
56
57 501 and BCT as key motivators for obtaining CE in their relevant field of knowledge within the
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2
3 502 premises of the NRBV's three dimensions, as shown by the beneficial direct influence TPM
4
5 503 and BCT have on CE. Equipment maintenance is crucial to a healthy CE since it helps keep
6
7 504 machines running for longer, cuts down on waste, and increases productivity (Infraspeak,
8
9 505 2022). For instance, Caterpillar's Cat Reman programme refurbishes decommissioned
10
11 506 machinery to provide clients not only substantial savings in the short term but also to assist
12
13 507 prolong product lifetimes and make better use of raw resources (Caterpillar, n.d.). Since TPM
14
15 508 has a positive impact on CE, its role in manufacturing companies may shift from a maintenance
16
17 509 practice or an activity on the shop floor to that of a facilitator of CE practices. This is because
18
19 510 of the positive effect that TPM has on CE. CE is already regarded as a necessity for
20
21 511 sustainability (Geissdoerfer *et al.*, 2017), and the development of TPM on CE will provide
22
23 512 TPM with a different persona as a facilitator of sustainable growth of manufacturing enterprises
24
25 513 owing to the influence of TPM on CE.

26
27 514 Furthermore, the positive influence of blockchain on CE can be recognised in its practical
28
29 515 ramifications, as blockchain also aids end-users in determining the most efficient means of
30
31 516 maintenance or disposal for products and/or their associated parts (Murphy, 2022). Because of
32
33 517 the level of detail in the collected data, all stakeholders in an item's value chain can take on a
34
35 518 fair share of accountability for the product's material movements, making the circular economy
36
37 519 a reality (Murphy, 2022). For instance, under the "EU's Circular Foam" initiative, Electrolux
38
39 520 and polymer manufacturer Covestro are collaborating to identify new solutions to recycle firm
40
41 521 PU foam from refrigerators. The manufacturer can now save information on the most efficient
42
43 522 ways to disassemble the refrigerator at the end of its useful life by employing blockchain,
44
45 523 simplifying the currently difficult physical operation (Murphy, 2022).

46
47 524 Managers in manufacturing businesses would do well to recognise the importance of TPM and
48
49 525 BCT as facilitators of CE due to the favourable effects they have on CE. In the long run, this
50
51 526 would lead to lower emissions, better product care, and the continued success of the

527 manufacturing company. Managers should realise that TPM and BCT are the motivation and
528 basis for CE projects within the premises of the NRBV theory.

529 6. Conclusions, limitations, and future scope

530 This study draws on the insights of working professionals at Indian manufacturing companies
531 implementing TPM, BCT, and/or CE. Experts in the manufacturing sector were interviewed
532 for this research. The study's findings, if taken in light of the study's conclusions, could be used
533 as a point of reference for manufacturing organisations considering the application of BCT and
534 TPM to obtain CE-driven benefits within the framework of the NRBV theory. Insights into
535 how the NRBV theory might be incorporated into the BCT, TPM, and CE action plans were
536 also gained from analysing the 316 responses received from manufacturing firms. The results
537 show that both BCT and TPM have significant benefits for improving CE processes; hence, it
538 is suggested that manufacturing companies adopt both technologies together.

539 The current research provides a comprehensive analysis of how TPM and BCT impact the CE
540 of manufacturing organisations. However, here are some of the caveats of the existing study
541 and some ideas for where to go next:

- 542 • In order to examine the impact of BCT and TPM on CE, these concepts were separated
543 in the present study. When compared side by side, BCT and TPM approaches use
544 different tools. But as TPM acts as a mediator in the relationship between BCT and CE,
545 studying the impact of BCT-TPM integration on CE is essential.
- 546 • The current research, grounded in the NRBV theory, investigates the impact of BCT
547 and TPM on the CE practices of manufacturing organisations. Nonetheless, it's still
548 possible that none of these three approaches will give the same association in a different
549 context. Future studies will be able to explore the connection among BCT, TPM, and
550 CE in many unrestricted settings.

551 • The present study does not indicate a priority order for BCT, TPM, and CE within the
552 context of the NRBV theory. Future studies may therefore examine alternative ranking
553 approaches to arrange the respondents' reports on a variety of technologies and
554 activities into a hierarchical framework consistent with the scope constraints of the
555 NRBV theory.

556 • The current research investigates the mediating effect of TPM on the association
557 between BCT and CE. That means we can look into how TPM moderates those similar
558 associations. Another possible avenue of inquiry into the relationship between BCT and
559 TPM is the potential mediating or moderating role played by CE. This study's
560 conclusions are limited to India because all of the researchers were employed by Indian
561 industrial companies. Researchers believe the findings are comparable to the results
562 achieved by industrial businesses in developing countries. When doing the follow-up
563 study, researchers should broaden their scope to include more sectors and nations.

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Figures

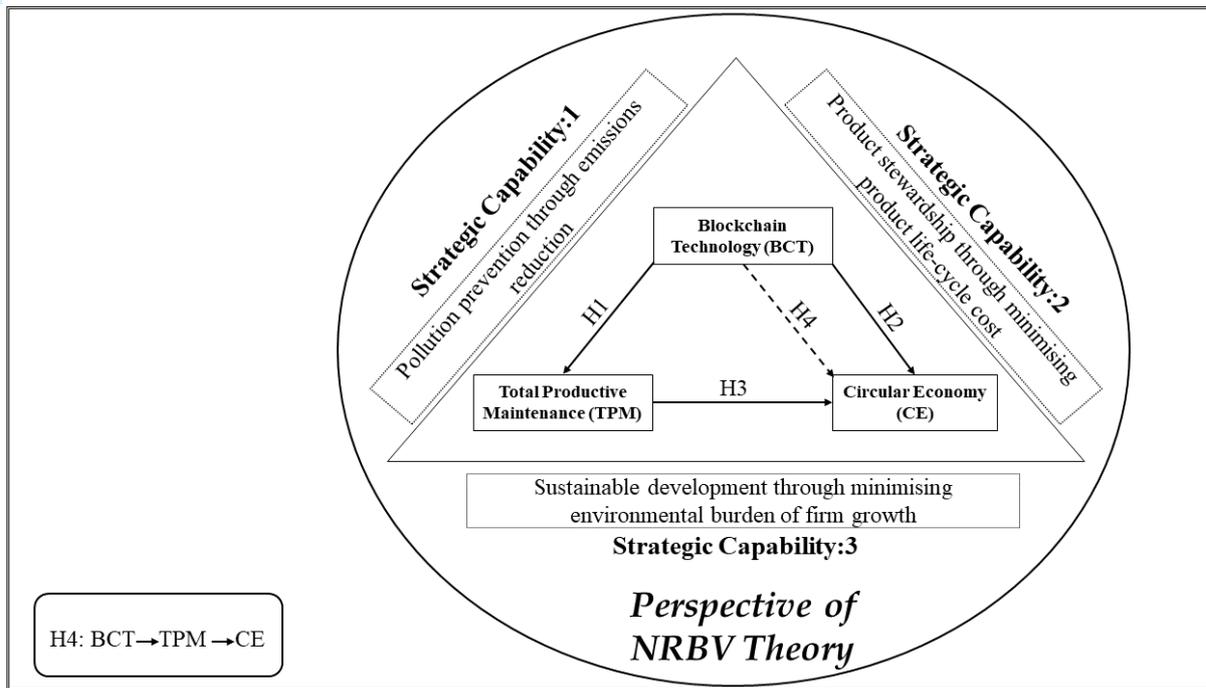


Figure 1: Conceptual Research Framework

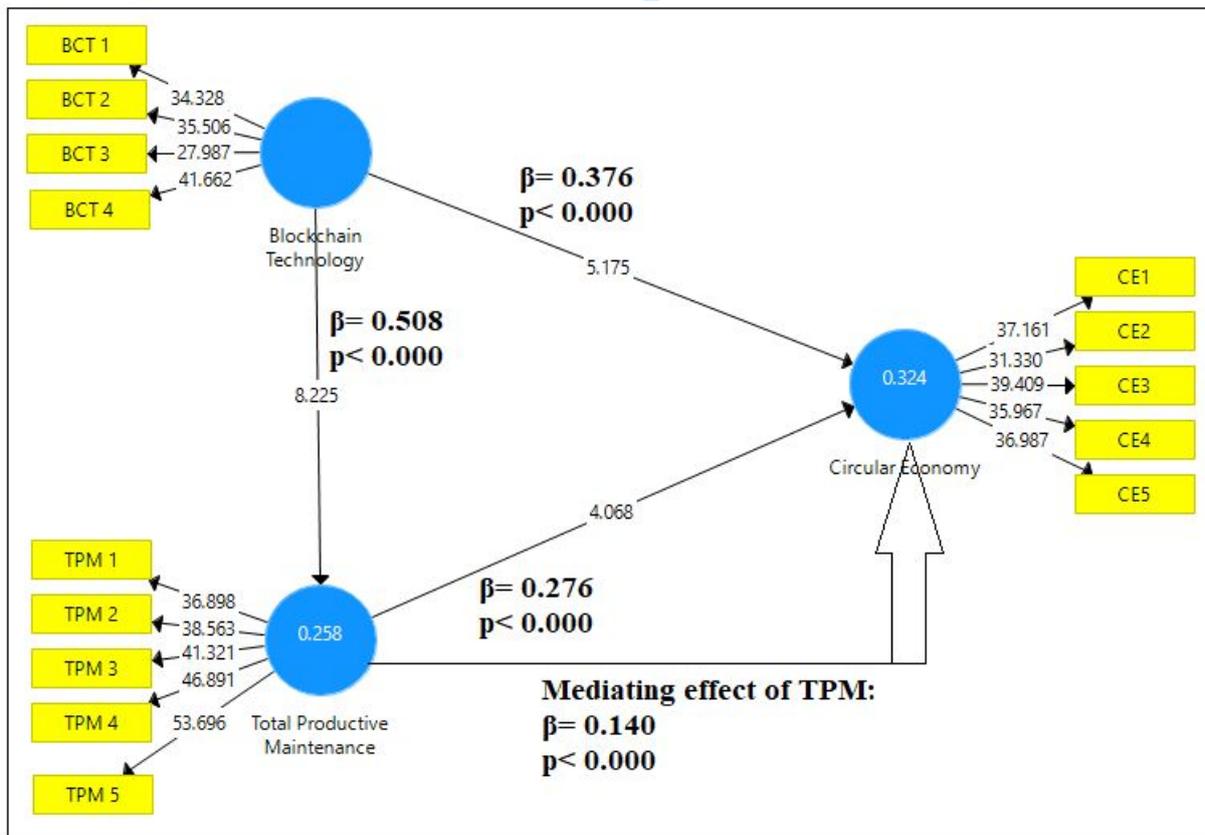


Figure 2: Empirical validation of the conceptual research framework

Tables

Table 1: Items adapted from the past literature to define the constructs

Constructs	Item code	Item statements	References
Blockchain Technology (BCT)	BCT 1	Do you agree that data in your company is obtained in real-time?	Cottrill (2018)
	BCT 2	Do you agree that activities information of the supply chain in your company could be tracked and traced?	
	BCT 3	Do you agree that your company use digital transactions throughout the supply chain to speed up the transactions and reduce the errors of manual documentation?	
	BCT 4	Do you agree that your company is using a consensus mechanism to provide data timely, authentic and secure throughout the supply chain?	
Circular Economy (CE)	CE 1	Do you agree that your firm focuses on waste minimisation in its process design?	Cheng <i>et al.</i> (2021)
	CE 2	Do you agree that your firm generates environmental reports for internal evaluation purposes?	
	CE 3	Do you agree that your firm reduces the use of hazardous products?	
	CE 4	Do you agree that your firm follows pollution prevention programmes?	
	CE 5	Do you agree that your firm reduces the consumption of materials and energy focus in design?	
Total Productive Maintenance (TPM)	TPM 1	Do you agree that your firm implements eight pillars of TPM on the shop floor?	Farrukh <i>et al.</i> (2022); Ahuja and Khamba (2008)
	TPM 2	Do you agree that maintenance practices in your company lead to the reduction of various losses related to the manufacturing system?	
	TPM 3	Do you agree that maintenance practices in your company reduces the ecological degradation?	
	TPM 4	Do you agree that maintenance practices in your company are associated with product stewardship and pollution prevention?	
	TPM 5	Do you agree that maintenance practices in your company improve the life cycle of equipment?	

Table 2: Summary of approached and responded manufacturing industries

S. No.	Firms type	Number of the approached individual firm	Number of received responses from an individual firm	Percentage of a responded firm to the approached firm	The particular firm response rate to the overall firms
1.	Industrial machinery	86	29	33.72%	9.17%
2.	Pharmacy	77	35	45.45%	11.07%
3.	Material handling equipment	65	28	43.07%	8.86%
4.	Automobile ancillaries	84	17	20.23%	5.37%
5.	Air conditioning machines/systems	69	34	49.27%	10.75%
6.	Chemicals and petrochemicals	78	28	35.89%	8.86%
7.	Textiles	17	7	41.17%	2.21%
8.	Wiring harness and parts	23	11	47.82%	3.48%
9.	Rubber and rubber products	54	29	53.70%	9.17%
10.	Reservoirs, tanks and other fabrications	38	17	44.73%	5.37%
11.	Solar modules	32	14	43.75%	4.43%
12.	Construction machinery	41	16	39.02%	5.06%
13.	Ceramic products	63	23	36.50%	7.27%
14.	Polyester or contract resins	56	28	50%	8.86%
TOTAL		783	316		

Table 3: Profile of respondents

S.No.	Respondent designation	Total number	Percentage
1.	Operations manager	93	29.43%
2.	Plant manager	90	28.48%
3.	General manager	32	10.12%
4.	Vice president	21	6.64%
5.	Production planner	39	12.35%
6.	Functional manager	41	12.98%
Experience			
1.	3-5 years	23	7.27%
2.	5-10 years	41	12.98%
3.	10-25 years	83	26.27%
4.	20-30 years	98	31.02%
5.	> 30 years	71	22.46%

Table 4: Representation of PLS-SEM results for items loadings, reliability, and validity

Constructs	Item code	Outer loadings	CA	rho_A	CR	AVE
Blockchain Technology (BCT)	BCT 1	0.824	0.839	0.841	0.892	0.674
	BCT 2	0.823				
	BCT 3	0.800				
	BCT 4	0.835				
Circular Economy (CE)	CE 1	0.825	0.879	0.882	0.912	0.674
	CE 2	0.806				
	CE 3	0.824				
	CE 4	0.829				
	CE 5	0.821				
Total Productive Maintenance (TPM)	TPM 1	0.830	0.896	0.902	0.923	0.707
	TPM 2	0.822				
	TPM 3	0.829				
	TPM 4	0.858				
	TPM 5	0.864				

Table 5: Measuring discriminant validity through HTMT criteria

	BCT	CE
CE	0.598	
TPM	0.581	0.520

Table 6: Inner VIF values

	CE	TPM
BCT	1.347	1.000
TPM	1.347	

Table 7: Results of the saturated model

Constructs	R^2	R^2 Adjusted	Q^2	SRMR
CE	0.324	0.319	0.213	0.055
TPM	0.258	0.255	0.177	

Table 8: Summary of algorithm and bootstrapping tests results

Hypothesis (Path)	Coefficient (β)	T Statistics	p -Value	Acceptance of hypothesis
Direct effects				

H1: BCT→TPM	0.508	8.225	0.000	Yes
H2: BCT→CE	0.376	5.175	0.000	Yes
H3: TPM→CE	0.276	4.068	0.000	Yes
Mediating effects				
H4: BCT→TPM→CE	0.140	3.579	0.000	Yes