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1	Building information modeling (BIM)-based modular integrated construction risk
2	management – Critical survey and future needs
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5	
6	Abstract
7	Modular integrated construction (MiC) is an innovative construction technology wherein complete
8	building modules are produced and preassembled in an offsite factory before their final installation
9	on the building site. It is fundamentally different from and has many advantages over the traditional
10	onsite construction technology. However, it still involves several risks. To successfully implement
11	MiC projects, effective MiC risk management (MiCRM) is crucial. Building information modeling
12	(BIM) and BIM-related digital technologies have been applied to facilitate MiCRM in recent years.
13	While numerous MiC studies exist, a critical analysis of BIM-based MiCRM is still missing. This
14	study aims to conduct a critical survey of BIM-based MiCRM, and to offer recommendations about
15	research gaps and future research directions. This was achieved by systematically identifying and
16	critically reviewing related publications from four outlooks: (1) MiCRM through BIM used alone,
17	(2) MiCRM through BIM used alongside sensing and tracking technologies (STTs), (3) MiCRM
18	through BIM used alongside 3D model creation and comparison technologies (3D-MCCTs), and
19	(4) other applications. Results indicated that using BIM alone for MiCRM has focused more on
20	the design phase. The overall idea to use BIM-STTs integration for MiCRM is very young. In this
21	direction, BIM-RFID integration has received most of the attention, although BIM-GIS integration

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is rarely explored. There are limited works around integrating BIM with 3D-MCCTs such as 22 photogrammetry and augmented and virtual realities for MiCRM. While schedule- and cost-related 23 risks have gained much attention in current BIM-based MiCRM research, facilities management, 24 sustainability, and safety risks are largely ignored. Based upon identified gaps, this study suggested 25 future research directions, including, e.g.: (1) BIM-based MiCRM software development, (2) fully 26 27 automated and practical BIM-based MiCRM systems development, and (3) BIM-automatic rule checking integration for MiCRM. This study contributes to a solid understanding of BIM-based 28 MiCRM and delivers a useful reference for its future practice and improvement within the industry. 29 Keywords: Industry 4.0; Digital technologies; Building information modeling (BIM); Modular 30 integrated construction (MiC); BIM-based MiC risk management. 31

#### 32 **1. Introduction**

The traditional onsite construction, which encompasses bringing materials, trades, and workers 33 to site to construct a project, has been the accepted construction method for years. Therefore, it 34 accounts for a significant percentage of the Architecture, Engineering and Construction (AEC) 35 industry. In recent years, however, the industry has experienced diverse construction methods 36 alongside the process of industrialization, causing the rise of offsite construction as a substitute for 37 38 the onsite method. Offsite construction is the process whereby building elements, components, or modules are manufactured and preassembled before their final installation on site [1]. Its 39 40 applications can be grouped into component subassembly, nonvolumetric preassembly, volumetric 41 preassembly, and modular integrated construction (MiC) [2].

MiC – the most complete form of offsite construction – is a form of construction in which freestanding volumetric modules (completed with fittings, fixtures, and finishes) are manufactured and
assembled in an offsite factory and then transported to the building site for installation [3]. With

MiC, around 80-90% of the whole building can be constructed inside the factory. Kamali and
Hewage [4] documented the lifecycle benefits of MiC. These benefits, which include construction
time, waste, cost and onsite manpower reduction, and improved safety, quality, productivity and
sustainability, are the core motivators for using MiC in the AEC industry.

Despite the benefits, MiC still involves several risks. Whereas some risks are common to all 49 50 AEC projects, others are unique to specific project types. MiC requires unique business model, design, supply chain, etc., which significantly differ from those of traditional construction [5]. It 51 also has to adopt a manufacturing instead of a construction process and philosophy if the benefits 52 53 have to be maximized [6]. These lead to unique risks in MiC projects such as MiC modules damage and installation errors, which could result in costly and time-consuming modifications/rework, 54 poor quality, and schedule delays. These risks can disrupt the successful implementation of MiC 55 projects, calling for effective risk management throughout the project. While the risk management 56 models/frameworks for traditional construction are not directly applicable to MiC [7], traditional 57 MiC risk management (MiCRM) is a manual, time-consuming, error-prone, paper-based, labor-58 intensive, and costly task [8]. The assessment is basically dependent upon personal experience, 59 and the decision-making is typically based on knowledge-based intuition, diminishing efficiency 60 61 in real-life practice [9].

To overcome these problems, there has recently been a new research trend of utilizing building information modeling (BIM) and BIM-related technologies to facilitate MiCRM – this innovation is termed in this study as BIM-based MiCRM. This study aims to conduct a critical survey of BIMbased MiCRM, and to offer recommendations about research gaps and future research directions. The following Section 1.1 discusses the knowledge gap addressed by and the contribution of this study, followed by Section 1.2 that provides a brief summary of this paper.

## 68 1.1. Knowledge gap and contribution

There are many studies on MiC risks, which were reviewed by Wuni et al. [5]. Although Wuni 69 et al.'s review focuses on identifying the critical risks, there are studies that develop and apply 70 BIM and BIM-related digital technologies for managing specific risks [10-14]. Most existing 71 reviews [15–19] partially summarize the application areas, benefits, risks, and challenges of 72 73 applying these technologies in MiC. Zou et al. [20] indicated that though several reviews of traditional risk management techniques exit, there was no extensive review of BIM-based risk 74 management research within the AEC industry. They attempted to address this gap; however, their 75 76 work focuses upon BIM-based risk management associated with traditional construction and does not address the unique features of MiC. There is no comprehensive survey of the state-of-the-art 77 in BIM-based MiCRM. This study aims at closing this gap. The main contribution of this study 78 includes (1) comprehensive survey of the current state-of-the-art in BIM-based MiCRM, and (2) 79 recommendations about research gaps and future research directions towards an ultimate goal of 80 81 improving BIM-based MiCRM in both academia and industry.

82 *1.2. Paper summary* 

This paper is organized as follows. Section 2 describes the research methodology. Section 3 83 84 presents research background, including risk management basics, general MiCRM process, and information and communication technology (ICT) for MiCRM. In Section 4, a comprehensive 85 86 survey of BIM-based MiCRM is presented. The relationship between BIM and MiCRM is first 87 discussed, followed by detailed reviews of MiCRM through BIM used (1) alone, (2) alongside sensing and tracking technologies (STTs), (3) alongside 3D model creation and comparison 88 89 technologies (3D-MCCTs), and (4) alongside other technologies. Section 5 discusses findings and 90 future research needs and Section 6 concludes this paper.

# 91 2. Methodology

To realize a critical survey and analysis of BIM-based MiCRM, a three-stage research approach (adopted from Zou et al. [20]) was employed in this research. Studies not published in English and the topic of 'risks of implementing BIM and BIM-related technologies' are beyond the scope of this research. A selected study must use BIM alone or BIM alongside other digital technologies to tackle MiC risks. Studies using digital technologies without BIM are not selected, as this study focuses on BIM-based MiCRM.

Fig. 1 demonstrates the overall research approach. In Stage 1, basics, process, and major challenges of traditional MiCRM were summarized through a comprehensive literature review. This stage also involved identifying keywords for data acquisition to establish a foundation for the next stage. To reach a comprehensive dataset of present research on BIM-based MiCRM, several relevant studies [4,5,18,20] were referred to in determining the keywords. Consequently, selected keywords included those in Table 1.

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# < Please insert Fig. 1 around here>

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The keywords covered three aspects. The first aspect represented BIM as an ICT for MiCRM. 106 107 The second and third aspects represented MiC and risk management topics, respectively. In Stage 2, the keywords were searched in three widely-recognized databases, Scopus, Web of Science, and 108 109 Google Scholar, to collect relevant publications on BIM-based MiCRM. The keywords search was 110 conducted using various combinations of the three aspects of keywords with "AND" and "OR" Boolean operators. For example, a keywords search was conducted for "BIM" OR "building 111 information model\*" AND "modular integrated construction" OR "modular construction" AND 112 113 "risk". To minimize the chance of omitting relevant publications, the publication year range was

- not limited. Moreover, following Kamali and Hewage [4]'s strategy, the "document type" was not
  limited, preventing publication bias. In Stage 3, identified publications were critically reviewed to
  survey the state-of-the-art in BIM-based MiCRM, including gaps and future needs.
- 117 **3. Background**

118 In this section, basics, process, and challenges of MiCRM, and the need to use ICT for MiCRM

- are discussed.
- 120 *3.1. Risk management basics*

Risks have both positive and negative sides. This study focuses on MiC risks' negative side to 121 122 facilitate the avoidance or mitigation of negative risks (threats) while exploiting or magnifying positive risks (opportunities). In MiC project context, risk is "the likelihood of a detrimental event 123 occurring to the project" [21]. MiCRM is a process involving risk management planning, 124 125 identification, analysis, response planning, response implementation, and monitoring on a MiC project [22]. MiC projects are one-off undertakings with several unique features such as offsite 126 manufacturing. Such complexities generate enormous risks, rendering MiC riskier than traditional 127 construction. When risks cannot be eliminated, as-early-as-possible identification and evaluation 128 of risks becomes necessary for managing risks effectively [23]. 129

There are numerous techniques for identifying and analyzing risks, which can be classified into quantitative and qualitative categories [20]. The former comprises environmental risk assessment, risk indices, etc. The later includes SWOT analysis, spreadsheets, etc. These techniques have been applied to risk management in both traditional construction [23] and MiC [7]. Despite being useful, they are still traditional techniques profoundly dependent upon experience and knowledge [24]. They are also only able to provide limited information [25]. Therefore, many studies indicate that

traditional risk management can play only a limited part in magnifying efficiency within the real-world [26], highlighting the necessity to use ICT for MiCRM.

138 *3.2. General MiCRM process* 

Despite several studies on the unique MiC risks, there are limited frameworks to manage these 139 risks effectively. Enshassi et al. [27] attempted to fill this gap, however their developed framework 140 141 manages only tolerance risks in modular design. So, there is still lack of a generic systematic MiCRM framework. Zou et al. [20] based on literature review and interviews to develop a general 142 risk management framework for AEC industry. Sousa et al. [28] based on the ISO 31000:2009 risk 143 management standard for a similar exercise. Because most existing risk management frameworks 144 focus on traditional construction, they have limited applicability in MiC. Based on existing 145 construction risk management frameworks, international risk management standards [29], and 146 147 detailed literature review, this study develops a novel generic systematic MiCRM framework (Fig. 2). A long-term goal is for this framework to enable more effective risk management throughout 148 MiC project lifecycle. 149

150

#### < Please insert Fig. 2 around here>

MiC is fundamentally different from traditional construction. One obvious difference is in the 151 152 stakeholders involved. MiC involves more stakeholders; manufacturers, for example, represent additional participants [18]. It also has more phases. Fig. 2 presents a MiCRM framework that 153 encourages stakeholders to work collaboratively for managing risks systematically. The core 154 155 philosophy, identified within the 'Risk Mitigation Model', is that risks should be identified and mitigated as early as possible, especially during the planning and design phases. If potential risks 156 157 could be effectively identified and planned for in these phases with proper corresponding control 158 measures, then they can be prevented from causing problems in later project phases. Hence, the

159 idea is to "design out" most of the foreseeable risks during the planning and design phases. The residual risks should be effectively managed in the manufacturing and subsequent phases. All 160 relevant stakeholders must be involved right from the project start, explaining why the large light 161 blue arrow in the framework points stakeholders to the planning and design phases. For example, 162 as each manufacturer has their own proprietary system for manufacturing MiC modules, involving 163 164 the inputs of the manufacturer and assembly company (main contractor) into the design upfront would help mitigate risks, e.g., constructability risks of the MiC design, leading to greater 165 construction productivity [30]. Having dedicated risk management experts/department can also 166 167 help in overseeing the entire MiCRM process with right expertise.

Certain challenges, however, in above process include higher requirement for: (1) effective 168 communication and collaboration environment, (2) efficient information transferring and sharing, 169 170 (3) decentralized decision-making, (4) real-time knowledge and experience capturing and analysis, (5) processes integration, (6) better coordination, (7) constant connectivity and (8) management of 171 multidisciplinary and interdisciplinary knowledge and experience. Knowledge/experience attained 172 from previous projects can be applied for contributing to future projects. Efficient management of 173 this big database of human knowledge and experience along with accurate and seamless extraction 174 175 and analyses of datasets [20] are critical to MiCRM success. As per current MiC practice in Hong 176 Kong and Singapore [8,31], for instance, normally, the designer passes the design drawings to the 177 main contractor, who then forwards it to the MiC manufacturer, who is usually an offshore one. 178 Based on the design drawings, the manufacturer develops the shop drawings, which must be sent back to the main contractor and designer for approval. Modules production cannot start until the 179 180 shop drawings are approved. Once the modules are produced, the manufacturer engages a third-181 party cross-border logistics company to transport them to the main contractor for assembly. Once

the project is done, handing over takes place. Throughout these processes, individuals/companies may leave the project once their tasks are done and critical risk data might be lost if they are not suitably documented and shared with other stakeholders [32]. This is where BIM and other digital technologies can solve challenges of current MiCRM.

186 *3.3. ICT for MiCRM* 

187 The fourth industrial revolution (Industry 4.0) represents the era of digitization. ICT is at the center of Industry 4.0 and can significantly improve risk management effectiveness [33]. It is 188 critical to risk evaluation, hazard monitoring, and early warning and alert systems [34]. Billante 189 190 [35] argued that as global AEC projects become more challenging, so does the intrinsic risk. And that innovative construction methods (e.g., MiC), regulations, materials, and features drive a 191 constantly changing landscape necessitating stakeholders and firms to embrace ICT for risk 192 management if they want to achieve success. Adopting ICT can have substantial impact on project 193 risk management, assisting the delivery of quality projects safely and on budget and time. 194

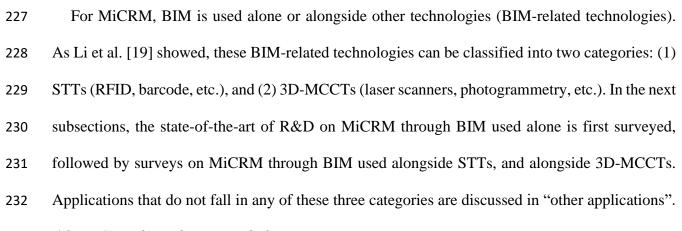
Hence, with the rapid advancements in ICT, ICTs such as BIM, RFID, and GIS, have been used 195 for managing risks in AEC industry in general and in specific project types. Zou et al. [36] applied 196 BIM to managing risks in bridge projects. Du et al. [37] proposed a GIS-GPS-BIM-based method 197 198 to control risks in subway station construction projects. According to Ahmad et al. [25], these ICTs aid decision-making and help overcome shortcomings of traditional risk management techniques. 199 200 They also provide novel management and design tools [38] and can considerably facilitate 201 communication and collaboration between stakeholders and organizations [39]. All these are key to MiCRM success. Thus, over the last few years, the development and adoption of BIM and BIM-202 203 related technologies for construction risk management has been augmented and extended to MiC. 204 This development is critically surveyed and discussed in the next section.

# 205 **4. Survey of BIM-based MiCRM**

- 206 This section discusses the relationship between BIM and MiCRM and presents a comprehensive
- survey on current state-of-the-art studies on BIM-based MiCRM.
- 208 4.1. Relationship between BIM and MiCRM

BIM is both a game-changing, disruptive technology and a process. In fact, both BIM and MiC 209 210 are game-changing, disruptive technologies. Their integration therefore plays a weighty role in transforming the AEC industry. As a technology, BIM assists project participants to visualize what 211 is to be constructed in a virtual environment to resolve any issues before the actual construction 212 213 [40], an integral part of risk management. BIM is a game-changing, disruptive technology, as it markedly changes project processes via digital integration. From a process standpoint, Autodesk 214 [41] defines BIM as a process that starts by creating an intelligent 3D model and enables 215 216 simulation, document management, coordination, integration, communication, and collaboration between project stakeholders. 217

Though studies using BIM to manage MiC risks do not usually refer to risk management 218 purposefully, the BIM application process itself can be viewed as a systematic approach to risk 219 management [42]. For example, the clash detection function of BIM is an effective way for 220 221 automatically identifying and solving 'clashes' in design before they can become bigger problems in the project. Moreover, BIM facilitates early risk identification/analysis by providing an 222 223 information-rich environment for preconstruction tasks like 3D visualization, forming a reliable 224 basis for devising risk mitigation measures in advance [26]. It provides a data generator, database or platform to allow risk analysis by itself and other tools [43,20]. BIM can therefore serve as a 225 226 risk management tool for MiC projects.



233 4.2. MiCRM through BIM used alone

Various risks exist in each MiC project phase and managing them effectively is critical to 234 235 project success. Within the planning and design phases, one of the main risks is design errors [44]. BIM can handle this risk through automation. Alwisy et al. [14] developed a BIM-based automated 236 system to easily detect and rectify errors in MiC design, extending their earlier work [45]. Sharma 237 et al. [46] presented a BIM-based design prototype to mitigate rigidity in MiC design. BIM's 3D 238 parametric models were used to build knowledge-based frameworks for accurate MiC project cost 239 estimation [47-49]. In practice, firms apply BIM to manage MiC design risks, leading to error-free 240 designs and improved documentation quality [50]. BIM can manage risks in other MiC planning 241 and design phase activities, e.g., scheduling [51,52], product information exchange [53], and 242 243 modular coordination-related modeling/documentation [54].

In the manufacturing phase, there is often pressure on the manufacturer/supplier to effectively manage schedule, quality, and quantity risks and improve productivity. To support this, Lee and Kim [55] developed BIM-based 4D simulation models for scheduling, quality, and quantity management of modules manufacturing process. From individual module manufacturing processes perspective, the models help in identifying optimal processes by visual reviews. From quality perspective, they afford visualizations for tackling risks such as manufacturing errors.

Within the logistics phase, Bataglin et al. [56] extended the application of BIM 4D modeling in MiC to the logistics operations planning and control process in Engineer-to-order context. They proposed guidelines concerning how to use BIM to evaluate the risk of changes in production plans considering the impacts on logistics.

In the onsite assembly phase, assembly planning and scheduling are two main concerns. BIM was employed in creating an automatic assembly sequence and schedule generation system [57] with three components, MS Access, Autodesk Revit, and MS Project, connected by a Revit API. Exporting the generated sequence and schedule results to MS Project facilitates resource leveling and communication among project stakeholders. The effectiveness of BIM in aiding MiC modules assembly sequence planning was further illustrated by Wang and Yuan [58], who developed a BIM-based assembly sequence planning methodology.

261 We identify that most previous applications of BIM as a stand-alone tool for MiCRM focused on the design phase where BIM is often used to generate and share design information. This may 262 be because generating and sharing design information represents one key function BIM was 263 customarily developed for [41]. During MiC design phase, BIM is applied for conceptual design, 264 detailing, analysis and documentation. Data generated here could inform preconstruction activities 265 266 like scheduling and cost estimation. Albeit this same data could further inform activities in later project phases, e.g., logistics, it is rare to apply BIM as a stand-alone tool for managing risks in 267 such phases. This observation concurs with that of Niu et al. [59], who detected that using BIM in 268 269 MiC logistics phase is largely ignored because of lack of geospatial data in BIM models. Due to shortcomings, using BIM in such phases typically demands combining it with other technologies 270 271 (GIS, etc.), as illustrated in subsequent sections.

Besides, while most previous studies focused on applications in individual phases, only few studies explored integration of various phases for optimizing MiC supply chain. This could explain why lack of supply chain phases integration is the most critical problem in MiC [60]. This problem must be solved, to unlock MiC's full value. Babič et al. [61] developed a BIM-based system to integrate design, manufacturing, and construction processes of MiC projects. This work is useful to optimizing MiC supply chain, but logistics, operation and maintenance, deconstruction, and recycling/landfill phases (Fig. 2) were not integrated.

279 4.3. MiCRM through BIM used alongside STTs

After discussing applying BIM alone for MiCRM in Section 4.2, this subsection discusses using

BIM alongside STTs – RFID and GIS – for MiCRM.

282 *4.3.1. BIM+RFID* 

Automatic identification and data collection (AIDC) is a family of ICTs for identifying and tracking objects [62]. RFID is part of this family. It utilizes electromagnetic fields to automatically identify and track objects based on RFID tags attached to them. In MiC domain, these objects include people, modules, equipment, etc. See MHI [62] for more information about RFID.

The need to integrate BIM with RFID to improve MiC delivery efficiency is recognized. Li et 287 288 al. [11] proposed an RFID-enabled BIM platform to improve the schedule performance of MiC. Smart construction objects (SCOs) enabled by IoT and cloud technology were developed along 289 with an RFID-enabled gateway for managing the SCOs. A BIM platform was established for real-290 291 time decision-making. Zhai et al. [8] replicated Li et al. [11]'s effort with some improvements. One of which being using smart-trinity-tag consisting of RFID tags, QR codes, and NFC tags 292 293 instead of using only RFID tags in their developed IoT-BIM platform. Such approach helps reduce 294 the chance of losing information because of failure of one tag type. Using BIM to help onsite

modules assembly has several benefits, e.g., providing a useful tool to manage physical and digital 295 presentations [12]. However, with lack of real-time visibility and traceability, and inefficient data 296 exchange, these benefits cannot be fully achieved. Li et al. [12] reported a platform based on IoT-297 BIM-RFID-cloud-VR integration to solve these issues. Similarly, Zhong et al. [63] explored an 298 IoT-RFID-BIM platform for real-time visibility and traceability of modules manufacturing, 299 300 transportation, and assembly. All above-mentioned studies focused on information visibility and traceability for monitoring project progress in real-time. 301

Cheng and Chang [64] devised an RFID-BIM platform to manage MiC lifecycle information, 302 303 where RFID helps store and retrieve information, and BIM creates database for building materials and components. Altaf et al. [65] created an RFID-BIM-simulation-based system to automatically 304 plan and schedule MiC manufacturing process. Their research showed that RFID data can contain 305 "considerable noise", such as corrupted times due to waiting times during project tasks. However, 306 most previous applications did not treat this noise, which could affect the accuracy and efficiency 307 of their developed BIM-RFID systems. Noisy RFID data may shift decisions from optimal results. 308 A way to treat this noise is to apply algorithms, e.g., random sample consensus algorithm, to extract 309 noise-free records for forming the basis for decisions [65]. There exist other studies applying BIM-310 311 RFID integration for MiCRM [13,66–70].

We observe that using BIM-RFID integration often necessitates using other ICTs, IoT, cloud 312 313 computing, mobile devices, etc., too. One reason is that to be able to use BIM-RFID integration to 314 track status of MiC objects, these objects must be converted into smart objects that can be tracked in real-time over the internet or in the cloud. Real-time internet- or cloud-based tracking allows 315 316 for better collaboration between remote project stakeholders.

317 4.3.2. BIM+GIS

While BIM provides process and product data, GIS provides geospatial data. Hence, integrating BIM and GIS is an effective way to introduce geospatial context into MiC design and construction [71]. This leads to safer, smarter, and resilient modular buildings, and reduced risk due to improved efficiency and prevention of critical data losses in various project phases [72]. By GIS data introducing geospatial elements into BIM models, MiC projects can be better designed and built within the context of their real-world surroundings.

Recently, there have been studies to explore how BIM-GIS integration can improve MiC. For 324 example, based on BIM-GIS integration, Niu et al. [59] proposed a platform for optimizing MiC 325 326 logistics. The platform has four layers; project 3D, city 3D model, road network and logistics route layers; and could help mitigate MiC logistics risks such as delayed or too early delivery of modules 327 to site. A case study was presented to demonstrate using the platform for identifying optimal 328 329 logistics scenario of trailer routes to meet onsite installation time of MiC projects. Despite its value, the platform only optimizes trailer routes from modules storage yards to construction sites. It does 330 not optimize routes from manufacturing yards to storage yards or construction sites. 331

We find that the overall idea to apply BIM-STTs integration for MiCRM is very young, as most 332 studies are quite recent, with BIM-GIS integration receiving very limited attention. Further studies 333 334 in this direction are promising. While most current studies focus on BIM-RFID integration, studies integrating BIM with STTs like labels, voice recognition, biometrics, smart cards, and cubing and 335 weighing [62] for MiCRM are uncommon. Meanwhile, BIM-voice recognition integration, for 336 337 instance, can allow eyes- and hands-free task execution and progress reporting. Hence, this gap is worth filling. This study's finding is justified by the fact that there are numerous suitable STTs in 338 339 the marketplace, but applications in the AEC industry of these are not common [73].

340 *4.4. MiCRM through BIM used alongside 3D-MCCTs* 

This subsection discusses using BIM alongside 3D-MCCTs – laser scanning, photogrammetry, 341 AR, and VR – for MiCRM. 342

4.4.1. BIM+3D laser scanning

343

Quality assurance/quality control (QA/QC) is required to safeguard the quality of a MiC project. 344 However, manual quality inspection is subjective, unreliable, labor-intensive and time-consuming. 345 346 Automated systems are needed to overcome these issues. By BIM-laser scanning integration, Kim et al. [74] presented a technique to automatically inspect and assess dimensional quality of MiC 347 objects. An as-built BIM was built from laser-scanned point-cloud data, and a BIM-based storage 348 349 and delivery approach was developed to help project participants update and share dimensional quality assurance data through manufacturing and assembly phases. Wang et al. [75] reported a 350 BIM-laser scanning-based quality assessment technique to estimate dimensions of MiC objects 351 352 with geometry irregularities. Wang et al. [76] introduced a technique to automatically build asbuilt BIMs of MiC objects from as-built dimensions captured through laser scanning. All aforesaid 353 applications focused on dimensional quality assessment aiming to hone the automation, accuracy, 354 and reliability of dimensions estimation. Other applications in this direction include [77–82]. 355

Some studies, instead, focused on quality control and tolerance analysis. Kalasapudi and Tang 356 357 [83] developed a framework integrating laser scanning with BIM for detecting and analyzing fitup problems in curved MiC units. A tolerance network provided a quality control framework for 358 adaptive redistribution of manufacturing and installation errors to resolve fit-up problems in MiC. 359 360 The risks of misalignments and inefficient tolerance analysis remained the focus in this case [84]. Though useful, current applications have limitations. They primarily focus on two issues: 361 362 geometric quality assessment (GQA) and geometric quality control (GQC). GQA has seen most 363 existing studies, where dimensional quality assessment is the main focus. Recent reviews [85,86]

364 showed that concerning GQA, laser-scanned point-clouds can be used for three purposes dimensional, deformation/deflection, and surface quality assessments. Deformation/deflection and 365 surface quality assessments remain to be sufficiently explored with BIM-laser scanning integration 366 in MiC realm. The foci of research on dimensional quality assessment include the sizes, shapes, 367 positions, etc. of MiC objects. More future studies on positioning are needed. Extant research using 368 369 BIM-laser scanning integration for GQA/GQC in MiC further focus more on four-sided shaped and flat-surfaced objects (e.g., rectangular objects) for convenience. Though complex geometries, 370 like cylindrical and interwoven ones, pose greater challenges to quality assurance in MiC [83], 371 372 they are largely overlooked, representing a promising direction for future research. BIM-laser scanning integration holds promise for not only automated QA/QC, but also several other problems 373 throughout a project – building renovation, safety management, heritage applications, etc. [85] – 374 375 which have received limited attention in BIM-laser scanning-based studies in MiC field.

Previously developed BIM-laser scanning-based techniques for MiCRM also have limitations. 376 377 Most of them need to refer to the as-designed BIM, in creating the as-built/as-is BIM [75]. Scan data offer as-built/as-is conditions, whereas BIM provides as-designed conditions. In reality, the 378 latter might be missing and even when it is available, there may be significant variances between 379 380 the as-designed and as-built/as-is conditions. The applicability of most of the techniques is limited, without an as-designed BIM. Most techniques were developed based upon only one surface scan 381 from only one scanner location for dimensions estimation, which limits the scan data 382 383 resolution/quality. Although the needed data quality could be specified based on the particular application's requirements [85], multiple scans from multiple scanner locations may improve data 384 385 quality. Transferring as-built/as-is dimensions to BIM was also not automated in most of the

386 techniques. Data preprocessing to eliminate noise can improve scan data quality. More BIM-laser scanning-based techniques addressing above issues [76] must be developed to improve MiCRM. 387 388 4.4.2. BIM+photogrammetry Photogrammetry, like laser scanning, can acquire point-clouds and integrate with BIM for 389 MiCRM. Photogrammetry is the method of acquiring information from photographs. It comprises 390 391 processing photographs of physical objects (e.g., MiC modules) to generate 3D digital models/information of them. There are several studies [87] explaining both laser scanning and 392 photogrammetry, but studies using BIM-photogrammetry integration for MiCRM are scarce. One 393 394 of limited efforts is own to Faltýnová et al. [88]. Even in this study, instead of using just BIMphotogrammetry integration, BIM-photogrammetry-laser scanning integration was used to create 395 a method for renovating modular facades of buildings. It was concluded that the method can lead 396

to fast, cost-efficient building renovation with minimal disturbances to occupants.

The field needs further studies applying BIM-photogrammetry integration to MiCRM. In this 398 future research direction, BIM-photogrammetry-laser scanning integration implementation is still 399 recommended because photogrammetry has shortcomings. For example, it is easily affected by 400 darkness. This can be overcome by laser scanning albeit it also has limitations photogrammetry 401 402 can overcome. Therefore, photogrammetry and laser scanning are viewed as complementary technologies whose integration "can lead to more accurate and complete products" [89]. There are 403 404 three types of laser scanners: terrestrial, airborne, and mobile laser scanners [86]. Whereas current 405 applications of BIM-photogrammetry-laser scanning integration have typically used terrestrial laser scanners where scan data acquisition necessitates manual movement of the scanner to 406 407 different locations, future research could employ airborne or vehicle-borne laser scanners for 408 deeper automation of data acquisition. It could also employ aerial photogrammetry and/or close-

range photogrammetry [90]. The former assisted by an aircraft or a drone is recommended in
situations, such as upper-level exteriors of high-rise modular buildings, where it may be difficult
or dangerous to use the latter assisted by humans.

412 *4.4.3. BIM+AR* 

AR combines the real and virtual worlds, by augmenting the real world with virtual data/objects. 413 414 It blends information produced by computer into an individual's view of a real-world environment, thereby providing a composite view, of both the real and virtual worlds. AR's biggest benefit is in 415 providing virtual information to make real-world tasks easier for humans to perform. AR is 416 417 typically applied in entertainment industries. Given its benefits, it is recommended to AEC industry. Wang et al. [91] proposed a framework for integrating BIM with AR so that the physical 418 context of AEC tasks can be visualized in real-time. Chu et al. [92] investigated the effectiveness 419 420 of integrating BIM with AR to augment AEC tasks efficiency. These studies suggest that BIM-AR integration can enhance tasks efficiency. 421

However, there is still limited research investigating using BIM-AR integration in MiC to 422 identify potential problems, tackle risks, and improve tasks efficiency. A real-time 4D BIM-based 423 AR system for MiC progress monitoring has only recently been invented by Lin et al. [93]. This 424 425 system compares as-designed AR models with as-built sites and has a markerless AR registration method for linking 4D BIM data with as-built ones. It helps avoid modules assembly errors through 426 427 offering a helpful tool for assembly schedule control and sequence monitoring. Tang et al. [94] 428 developed a workflow for BIM-AR-based MiC design visualization and installation to allay risks such as "unreasonable design". BIM-AR application in MiC deserves more exploration. Such 429 430 works would be more effective when BIM-AR integration is executed alongside STTs like RFID 431 (Section 4.3.1) [91]. A reason is that although 3D-MCCTs help capture/analyze data from the real

environment, they do not enable objects to be smart in regard to communicativeness, autonomy,and awareness for enhancing MiC efficiency [19].

434 *4.4.4. BIM+VR* 

Both VR and AR are immersive technologies. They emulate the real world through the virtual 435 world by surrounding users with a sensual feeling, thereby building a sense of immersion. The 436 437 main difference between VR and AR is that VR completely replaces the real world with a virtual one, whereas in AR, the virtual world complements the real world rather than completely replacing 438 it. To be precise, VR fully immerses users inside a virtual environment. Once immersed, users are 439 440 unable to see the real world. AR, conversely, allows users to see the real world together with virtual objects meant to improve users' perception of reality. To put this in context, in MiC, VR can be 441 used to, for example, establish a walk-through simulation of the inside of a new modular building, 442 while AR can be used to show parts of the building superimposed upon a real-world view. As such, 443 VR and AR can assist users to better understand MiC design solutions. However, they are limited 444 by their inability to facilitate interoperability and collaboration among project participants. This 445 shortcoming could be addressed by depending on openBIM and industry foundation classes (IFC) 446 schema capabilities to allow for communication and simultaneous multiuser among applications 447 448 via BIM server concept. Against this background, Rahimian et al. [95] developed an OpenBIM-Tango integrated virtual showroom for offsite manufacture of self-build housing that interactively 449 450 presents BIM models and IFC data to users within VR and AR environments in real-time. Not only 451 can the showroom streamline the design process via early involvement of stakeholders in decisionmaking. It can also solve interoperability issues of the MiC industry. Like BIM-AR integration, 452 453 BIM-VR integration has seen limited applications in MiC, warranting future research attention. 454 4.5. Other applications

- This subsection discusses using BIM alongside other technologies other than STTs and 3D-MCCTs for MiCRM.
- 457 *4.5.1. BIM+simulation+optimization*

Aiming at improving the performance and productivity of MiC manufacturing, Barkokebas et 458 al. [96] used BIM-simulation integration to maximize the effectiveness of using data available 459 460 within BIM models of MiC projects. BIM-particle swarm optimization-simulation integration can solve scheduling problems in MiC [43]. It can automatically generate optimized project schedules, 461 reducing schedule risks, which otherwise can result from human errors. Wang et al. [97] proposed 462 463 a BIM-improved genetic algorithm (IGA)-based integrated method to address assembly sequence planning and optimization problem in MiC. IGA identifies optimal assembly sequence while BIM 464 validates the optimal results by simulation. 465

466 *4.5.2. BIM+SWT* 

The success of a MiC project largely hinges on early involvement of the manufacturer in the different project phases, particularly the design phase. Nevertheless, manufacturers' involvement can be hampered by the lack of links between their product catalogues and the project's BIM model. To overcome this problem, Costa and Madrazo [98] used semantic web technologies (SWT) to link product catalogues of manufacturers with BIM models.

472 *4.5.3. BIM+context-aware cloud computing* 

Abedi et al. [60] identified the major risks in MiC supply chain, including poor coordination, improper planning and scheduling, wrong modules deliveries, lack of integration, poor production timing, poor control and supervision, and poor communication between stakeholders. A contextaware cloud computing BIM prototype was created for MiC supply chain management to mitigate

these risks. After surveying existing research, the following Section 5 discusses findings and futureresearch needs.

### 479 **5. Discussion and future needs**

This study has surveyed the current state-of-the-art in BIM-based MiCRM, based upon which 480 Table 2 offers a list of 47 potential risks in MiC projects together with BIM-based risk management 481 strategies to tackle them. Previous reviews [5] documented MiC risks but did not provide (BIM-482 based) strategies to manage them and our documentation is also more comprehensive. The risks 483 are classified into six categories: planning and design, manufacturing, logistics, onsite assembly, 484 485 multi-phase, and universal risks. The first four categories are developed based on MiC project phases. Two criteria in classifying factors are "the context of the study itself and the body of 486 underlying theory" [99]. Accordingly, the project phases from MiC project management theory 487 are referenced in developing the risk categories. The multi-phase risks can occur in multiple, but 488 not all, phases. For example, "inefficient verification of modules due to ambiguous labels" (MS1) 489 can occur in manufacturing, logistics, onsite assembly, operation and maintenance, deconstruction, 490 and recycling/landfill phases, but not in planning and design phase. The universal risks, e.g., "poor 491 communication between stakeholders" (U1), can occur in all phases. Table 2 lacks operation and 492 493 maintenance-, deconstruction-, and recycling/landfill-specific risks, because of dearth of BIMbased MiCRM studies on them. This gap should be filled. Due to word limitation, the four risk 494 categories focusing on MiC project phases are discussed as follows. 495

496

#### < Please insert Table 2 around here>

*Planning and design risks*. These risks occur very early in the project and if unmanaged, can
cause more risks in the project later. Design errors (PD1) should not be tolerated in MiC because,
unlike in traditional construction, in MiC, it is highly difficult to make any design changes (PD2)

500 later in the project, especially in the onsite assembly phase where the modules have already been manufactured and transported for installation. And during modules manufacturing, fixing PD1 can 501 be costly and time-consuming, adversely impacting project cost and schedule. PD1 can also cause 502 several other risks such as inefficient (e.g., delays in) design approval process (PD12), inaccurate 503 quantities takeoff and cost estimation (PD8), and manufacturing errors (M2) (in the manufacturing 504 505 phase). Automating MiC design with BIM is an effective strategy to eliminate PD1. BIM allows automatic, instead of manual, review of MiC designs to discover and repair any errors (overlapping 506 geometries, etc.) before approving shop drawings for modules manufacturing. Moreover, using 507 508 BIM, shop drawings can be created without the need for cross-coordination and detailed checking between numerous drawings [50], managing the risk of long design hours (PD5). Another benefit 509 of BIM automation of MiC design is that as BIM is an object-based parametric design technology, 510 511 throughout the design process, PD2 can easily be managed because once an object is modified, all other related objects are also automatically modified. 512

Manufacturing risks. Whereas most risks in the planning and design phase can be managed with 513 BIM alone, in the manufacturing and subsequent phases, integrated technologies are required for 514 managing most risks. Poor production planning and scheduling (M1), for instance, can jeopardize 515 516 the success of a MiC project. Such risk can be handled via integrated systems such as BIM-RFIDsimulation-based integrated system. In such system, RFID can be used to automatically acquire 517 518 real-time production data, which can then be utilized for building a simulation model, which when 519 integrated with an optimization algorithm, leads to automatic optimization of production plan and schedule [65]. One key role of BIM in this system is to feed information on building elements into 520 521 the simulation model and RFID printer.

Logistics risks. Logistics is one of the most critical and challenging aspects of MiC. Not only 522 must heavy/bulky modules be transported, but related regulatory requirements should also be met. 523 Five main MiC logistics risks are identified, including delayed or too early delivery of modules to 524 site (L1), human errors-caused logistics information inconsistency (L2), wrong modules deliveries 525 (L3), misplacement in the warehouse due to carelessness (L4), and inefficient overall logistics 526 527 management (L5). Once L5 is well managed, L1-L4 may automatically be managed. A BIM-based strategy to manage L5 is to integrate BIM with RFID for intelligent MiC logistics management. 528 With a BIM-RFID-based intelligent MiC logistics management model, full lifecycle monitoring 529 530 of MiC objects, and improved overall efficiency through real-time sensing, uploading, and tracking of information (e.g., materials and production information) can be achieved [66]. There can also 531 be effective communication between the factory, transportation and onsite crews to ensure right 532 533 and just-in-time (JIT) deliveries of modules to site.

Onsite assembly risks. MiC introduces to the AEC industry a new problem called assembly 534 sequence planning (ASP), a popular problem in the manufacturing industry. A modular building 535 with "n" number of modules has "n!" assembly sequences from which determining the optimal 536 assembly sequence is very difficult. ASP aims to determine this optimal assembly sequence, which 537 538 is necessary to reduce assembly time and cost and bolster quality. Inefficient assembly sequencing (OA1) is thus detrimental to the schedule, cost, and quality of MiC projects. To address this risk, 539 BIM can be combined with optimization algorithms (e.g., IGA) in finding the optimal assembly 540 541 sequence from the possible assembly sequences [97]. Addressing OA1 can contribute to addressing other onsite assembly risks like modules installation errors (OA5). 542

It is identified in Section 4 and Table 2 that for MiCRM, BIM can be used alone or alongside
other digital technologies, namely STTs and 3D-MCCTs. This survey is conducted to understand

the up-to-date developments and efforts, besides relevant research gaps and opportunities. It is 545 found that most efforts on using BIM alone to manage MiC risks focus on the design phase. Many 546 new MiCRM systems have been developed, integrating BIM with other digital technologies. These 547 integrated systems are useful tools in managing MiC risks. Yet, most are not yet sufficiently 548 developed. Only few BIM-GIS-, BIM-photogrammetry-, BIM-VR-, and BIM-AR-based systems 549 550 have been developed for MiCRM. The survey further showed that BIM-RFID- and BIM-laser scanning-based systems have received relatively more attention. But even so, they do not address 551 several essential issues in MiC. For example, the BIM-laser scanning systems focus more on 552 553 dimensional quality assessment, while neglecting issues like safety management, building renovation, and heritage applications. We expect the use of BIM and BIM-related technologies for 554 MiCRM to increase as its potential gets better understood and as Industry 4.0 evolves. As every 555 556 technology has weaknesses, this study suggests future applications to use hybrid approaches to cover weaknesses. BIM may be combined with as many as possible STTs, 3D-MCCTs, etc. in any 557 558 single application for robustness.

While Table 2 was developed based on MiC risks and BIM-based strategies used to tackle them 559 in the reviewed studies, Fig. 3 summarizes this study's findings based on the foci and gaps of the 560 561 reviewed studies as discussed in Section 4. Based on gaps of existing research, recommendations about future research directions to improve BIM-based MiCRM – including BIM-based MiCRM 562 563 software, fully automated and practical BIM-based MiCRM systems, a holistic BIM-based 564 MiCRM approach, an industry 4.0-DfMA-multidisciplinary-interdisciplinary system-thinking, BIM-automatic rule checking integration for MiCRM, and BIM-cybersecurity-blockchain 565 566 integration for MiCRM – are also summarized in Fig. 3. These recommendations are discussed in 567 the following subsections.

568

# < Please insert Fig. 3 around here>

# 569 5.1. BIM-based MiCRM software

The first recommendation is about the development of BIM-based MiCRM software. Various 570 BIM-based systems have been developed for MiCRM, each having its own focus. The implication 571 in practice is that to achieve a complete BIM-based MiCRM, practitioners must use different 572 systems for managing different risks at different project phases. This can cause acute information 573 fragmentation problems, reducing efficiency and productivity. To solve this problem, future 574 research could develop BIM-based MiCRM software to help conduct all MiCRM activities in one 575 576 place. The software could be cloud-based to enable real-time usage among the typically dispersed MiC project stakeholders. Zou [42] proposed to develop BIM-based risk management software for 577 bridge projects. Though such development could be extended to MiC, it has yet to be conducted. 578 579 Another approach is to extend BIM dimensions to cover MiCRM. Since its emergence, BIM has been improved from 3D to 8D, as exemplified in Fig. 4 [100]. Drawbotics [100] indicated that 580 "this technology has no limit since it is possible to add as many data as you want." Therefore, 581 exploring the possibility to introduce a BIM dimension specifically designed for MiCRM might 582 be interesting. A MiCRM plugin may also be developed for integration into any BIM software. 583 584 The availability of a centralized BIM-based MiCRM software could help improve information management and thereby success in a MiC project as it provides a single source of information to 585 586 prevent potential information fragmentation, inconsistencies or even loss in MiCRM.

587

### < Please insert Fig. 4 around here>

588 5.2. Fully automated and practical BIM-based MiCRM systems

589 The second recommendation is two-fold. The first fold deals with developing fully automated590 BIM-based MiCRM systems. Previous studies claimed that manual handling is time-consuming

and error-prone and therefore can significantly reduce efficiency in practice, a major justification 591 for their development of BIM-based automated systems for MiCRM. It is thus interesting to 592 observe that most of the developed systems still necessitate substantial manual handling in their 593 implementation. In Liu et al. [43]'s study, "part of the simulation network still needs to be 594 established manually." To enhance the performance of existing systems, future research should 595 develop fully automated systems. Where full automation cannot be achieved, the possibility of 596 developing systems that can detect and/or rectify human errors as they occur could be explored. 597 Without these, manual handling and human errors may continue to limit efforts to improve industry 598 599 practice through automation.

The second fold concerns developing practical BIM-based MiCRM systems. BIM-based 600 MiCRM studies can be categorized into two levels: practical and proof-of-concept levels. Efforts 601 602 at the practical level focus on developing systems that can be applied in the industry. Systems developed at the proof-of-concept level are far from industrial applications, as they only symbolize 603 outcomes of restricted experimental works conducted to prove certain concepts. Only few of the 604 now-developed BIM-based MiCRM systems are at the practical level. Most are at the proof-of-605 concept level and lack testing and execution in real-life project environments. Addressing this gap 606 607 could help maximize the benefit of BIM-based MiCRM R&D to the industry and society.

608 5.3. A holistic BIM-based MiCRM approach

The third recommendation is about adopting a holistic approach to BIM-based MiCRM. As Fig. 4 shows, BIM has six dimensions ranging from 3D to 8D. Existing BIM-based MiCRM research pays much attention to the first three Ds (visualization, scheduling, and cost estimation), while paying limited attention to facilities management, sustainability, and safety risks. Visualization, scheduling, and cost estimation are all performed in project planning and design

phase, and the substantial focus on this phase, as identified in Section 4.2, explains why schedule-614 and cost-associated risks have received much attention. There remain limited studies applying BIM 615 to manage risks in facilities management phase of MiC projects. This may be attributed to the 616 perception that the areas wherein MiC has caused *significant* disruption are design, manufacturing, 617 logistics, and onsite construction, hence attention might have been biased toward other areas. 618 619 Further studies are also needed to utilize BIM to enhance MiC projects sustainability and safety. One suggestion is to analyze how BIM can be used to monitor workers safety during installation 620 of the heavy/bulky modules. It is commonly understood that MiC is surely a sustainable approach, 621 622 as it reduces the impact of construction on the environment by waste, noise, and dust reduction. This understanding may be a contributing factor in the partial focus on sustainability risks. It 623 should not be overlooked that sustainability is not just about waste, noise, and dust reduction. It 624 625 covers other broader issues, e.g., CO<sub>2</sub> emissions. A holistic BIM-based MiCRM approach is needed to tackle the complete world of risks, to significantly improve the chance of MiC project 626 627 success.

628 5.4. An industry 4.0-DfMA-multidisciplinary-interdisciplinary system-thinking

The fourth recommendation concerns embedding the concept of industry 4.0-DfMA-629 630 multidisciplinary-interdisciplinary system-thinking in the research and practice of BIM-based MiCRM. Zou et al. [20] suggested to implant a multidisciplinary system-thinking into the research 631 632 and practice of BIM-based risk management in traditional construction. However, the system-633 thinking required for BIM-based MiCRM is much more than just a multidisciplinary one. Here, an industry 4.0-DfMA-multidisciplinary-interdisciplinary system-thinking is required. Industry 4.0 634 635 is upon the AEC industry, demanding it to transform through digitization, robotization, 636 automatization, and additive manufacturing. BIM and BIM-related technologies help the industry

to digitize and integrate vertical and horizontal value chains [101]. As for MiC, it moves 637 construction tasks to manufacturing environment wherein high-level automation and robotics can 638 be applied. By so doing, it naturally brings together experts with multidisciplinary and 639 interdisciplinary background to complete the project. Also, MiC is a DfMA (design for 640 manufacture and assembly) technology, meaning DfMA principles [102] must be followed to 641 642 mitigate risks. From above discussion, it is clear that the concept of industry 4.0-DfMAmultidisciplinary-interdisciplinary system-thinking must be embedded in the research and practice 643 of BIM-based MiCRM. Addressing this recommendation is important to ensure that necessary 644 645 knowledge, skills and expertise are employed for effective BIM-based MiCRM, which is critical to the success of MiC projects. 646

## 647 5.5. BIM-automatic rule checking integration for MiCRM

The fifth recommendation deals with integrating BIM and automatic rule checking (ARC) for 648 MiCRM. ARC means using computer software for assessing a design against rules, with outcomes 649 such as "pass", "fail", "warning", or "unknown" [103]. The MiC industry is regulated mainly at 650 the state and local levels by agency and code administrators [104] and a MiC project must satisfy 651 all local building codes. The MiC manufacturer may be an offshore one who may not be fully 652 653 familiar with the local codes where the building is to be located, but still has to prevent any noncompliance. In MiC, all the same building codes and requirements for traditional construction must 654 655 be met in addition to additional ones. In Hong Kong, for instance, "special traffic arrangement 656 needs to be made for transportation of modules with width larger than 2.5 meters" [3]. Employing BIM-ARC integration to ensure all building codes and special requirements are met is critical to 657 658 mitigate risks in MiC projects. Yet, such research efforts are currently missing.

659 5.6. BIM-cybersecurity-blockchain integration for MiCRM

660 The last but not the least recommendation is to integrate BIM with cybersecurity and blockchain technologies for MiCRM. As BIM and BIM-related digital technologies are used to enable project 661 stakeholders to have a common data environment (CDE) to store, update, share and collaborate 662 with the information they need throughout project lifecycle, the security of this information 663 becomes increasingly vital. It is essential to protect the computer systems and networks enabling 664 665 the CDE against cyberattacks and ensure project information are accessible to only those who are authorized. This problem is not a focus within current BIM-based MiCRM research and can be 666 addressed with BIM-cybersecurity-blockchain integration in future work. 667

668 6. Conclusions

Different from previous studies that only reviewed MiC risks, this study critically surveyed the 669 current state-of-the-art in BIM-based MiCRM for the first time. This study has both theoretical 670 671 and practical contributions. For theory, the results provide the first inclusive agenda for leveraging and advancing BIM and its related technologies in MiCRM research with showcasing the existing 672 research, highlighting fundamental problems to be addressed, and providing recommendations that 673 give directions regarding how to address the shortcomings in defining future research. For practice, 674 this study offers practitioners a synthesized and readily-available point of reference that captures 675 676 the state-of-the-art of BIM-based MiCRM research, through which cutting-edge technologies and methods are introduced. This gives practitioners a benchmarking tool to assess their maturity in 677 678 terms of applying BIM and its related technologies for MiCRM and also enhance their readiness 679 for implementing BIM-based MiCRM. Moreover, this study developed a new MiCRM framework and a comprehensive documentation of potential MiC project risks together with corresponding 680 681 BIM-based risk management strategies, which can be useful for MiCRM planning and application. 682 The documentation helps practitioners appreciate risks they are likely to face in MiC projects and

BIM-based strategies to manage them, while the framework facilitates effective MiCRM throughstakeholder collaboration.

Despite its contributions, this study has limitations. The technologies discussed along with BIM 685 include RFID and GIS (STTs), laser scanning, photogrammetry, AR and VR (3D-MCCTs), and 686 simulation, optimization, SWT and context-aware cloud computing (others). We appreciate that 687 688 some STTs, for instance, were not discussed because of current dearth of research integrating them with BIM for MiCRM. Once the field matures, this survey may be improved by considering other 689 technologies. Future work could also provide demonstrations on how to use the technologies. The 690 691 next phase of this study focuses on developing a roadmap for integrating BIM and BIM-related technologies into MiCRM, while cost-benefit analysis of BIM-based MiCRM remains untouched. 692 We expect BIM-based MiCRM to expand in response to Industry 4.0. For successful 693 implementation, the industry and academia are recommended to focus on people and develop their 694 digital skills and culture through relevant education and training first. This is because the success 695 696 of BIM-based MiCRM depends on not only the technologies used, but also the knowledge, skills, capabilities, creativity and culture of the people using them. Without proper education and training, 697 it may be difficult to convince workers especially at the project site level to use digital technologies 698 699 for identifying and communicating risks. The situation is even worse when they do not know how 700 to use the developed technologies. It is also proposed to train and develop DfMA-oriented industry 701 professionals and workers.

702 **Declaration of interests** 

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#### 998 999 **Table 1**

1000 Literature search keywords

Aspect	Keywords
BIM	"BIM", "building information model", "building information modeling", "building information modelling"
MiC	"Modular", "modular construction", "modular integrated construction", "modular building", "modularization", "modern methods of construction", "off-site construction", "offsite construction", "off-site manufacturing", "offsite manufacturing", "off-site manufacture", "offsite manufacture", "prefabricated building", "prefabricated construction", "pre-cast construction, "precast construction" "industrialized construction", "industrialized building", "prefabricated prefinished volumetric construction"
Risk management	"Risk", "risk management", "risk analysis", "risk assessment", "cost", "time", "schedule", "safety", "budget", "quality"

#### Table 2 1002

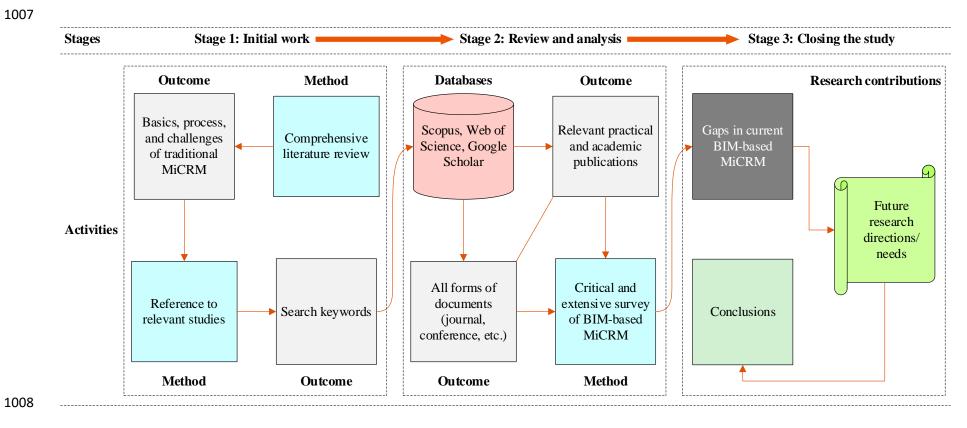
Risk categories	Code	Risk factors	BIM-based risk management strategies	Key references
Planning and design risks	PD1	Design errors	BIM automation of MiC design	[14,50]
	PD2	Design changes	BIM automation of MiC design	[11,14]
			BIM-RFID integration for efficient communication	
			among stakeholders	
			BIM-RFID integration for efficient information	
			transmission between design and manufacturing phases	
	PD3	Design assumptions	BIM automation of MiC design	[14]
	PD4	Redundant design activities	BIM automation of MiC design	[14]
	PD5	Long design hours	BIM automation of MiC design	[14,54]
		6	Modular coordination rules-BIM process integration	L 7- J
	PD6	Insufficient integration of	Using SWT to link product catalogues of manufacturers	[95,98]
		manufacturers into design phase	with BIM models	[, , , , , ]
		manufactarers mits design phase	BIM-AR-VR integration for early involvement of	
			manufacturers in design phase	
	PD7	Poor project planning and scheduling	BIM-PSOT-simulation integration for automatic	[43,60]
	127	r oor projeet pranning and benedaring	generation of project schedules	[10,00]
			BIM-CCT integration for MiC supply chain management	
	PD8	Inaccurate quantities takeoff and cost	BIM automation of quantities takeoff and cost estimation	[47–49]
	100	estimation	Divi automation of quantities takeoff and cost estimation	[לד זד]
	PD9	Rigidity in design process	BIM automation of MiC design	[46]
	PD10	Design information gap between	BIM-RFID integration for passing design information to	[11]
	1010	designer and manufacturer	manufacturer without gaps	[11]
	PD11	Inefficient design data transition	BIM-RFID integration for passing design information to	[11]
	IDII	memerent design data transition	manufacturer without ambiguities	[11]
	PD12	Inefficient design approval process	BIM-RFID integration for efficient communication	[11]
	1012	memetent design approval process	among stakeholders	[11]
			BIM-RFID integration for efficient information	
			transmission between design and manufacturing phases	
	PD13	Inconsistencies in modular design	Modular coordination rules-BIM process integration	[54]
	1015	-	Modulal coordination rules-bitw process integration	[54]
Manufacturing risks	M1	process Poor production planning and	BIM-RFID-simulation integration for automatic modules	[60 65 06]
Manufacturing fisks	1011		production planning and scheduling	[60,65,96]
		scheduling	BIM-simulation integration for design for MiC	
			manufacturing	
	MO	Manufa atumin a among	BIM-CCT integration for MiC supply chain management	[55]
	M2	Manufacturing errors	BIM-based 4D simulation for managing module	[55]
	MO		manufacturing processes	[0/]
	M3	Inaccurate quantities takeoff for labor	BIM-simulation integration for design for MiC	[96]
	14	and material estimation	manufacturing	[0]
	M4	Uninformative shop drawings	BIM-simulation integration for design for MiC	[96]
			manufacturing	

	M5	Poor inventory control	BIM-RFID-barcode-QR code-IoT integration to achieve JIT inventory control	[67,70,96]
			BIM-simulation integration for design for MiC	
	M6	Inefficient material and labor resource	manufacturing BIM-simulation integration for design for MiC	[96]
	147	allocation	manufacturing	[22]
	M7	Lack of plans for using factory space and equipment	BIM-based 4D simulation for managing module manufacturing processes	[55]
	M8	Lack of understanding of process plans	BIM-based 4D simulation for managing module manufacturing processes	[55]
	M9	Changes in production plans	4D BIM visualization of site-assembly progress	[56]
	M10	Materials wastage	BIM-based 4D simulation for managing module manufacturing processes	[55]
	M11	Complications owing to performing manufacturing and material preparation tasks concurrently	BIM-based 4D simulation for managing module manufacturing processes	[55]
	M12	Poor manufacturing quality due to inability to inspect documents	BIM-based 4D simulation for managing module manufacturing processes	[55]
	M13	Inability to plan material purchases and storage because of lack of material quantity information for a particular process	BIM-based 4D simulation for managing module manufacturing processes	[55]
	M14	Ineffective production line balancing	BIM-RFID integration for effective modules production line balancing	[68]
ogistics risks	L1	Delayed or too early delivery of modules to site	BIM-GIS integration to achieve JIT delivery of modules to site BIM-RFID integration to achieve JIT delivery of modules to site	[11,59,69]
	L2	Human errors-caused logistics information inconsistency	BIM-RFID integration to facilitate information sharing between different ERP systems	[11,13]
	L3	Wrong modules deliveries	BIM-CCT integration for MiC supply chain management	[60]
	L4	Misplacement in the warehouse due to carelessness	BIM-RFID integration for real-time visibility and traceability	[11]
	L5	Inefficient overall logistics management	BIM-RFID integration for intelligent MiC logistics management	[66]
Onsite assembly risks	OA1	Inefficient assembly sequencing	BIM automation of assembly sequencing process BIM-improved genetic algorithm integration for assembly sequence planning and optimization	[57,58,97]
	OA2	Inefficient assembly scheduling	BIM automation of assembly scheduling process	[57]
	OA3	Interpreting shop drawings onsite	BIM automation of MiC design	[14]
	OA4	Breakdown of tower crane	BIM-RFID integration to improve interoperability between various stakeholders and their varied enterprise information systems	[11]
	OA5	Modules installation errors	BIM-RFID integration for efficient modules installation management	[11,93,94]

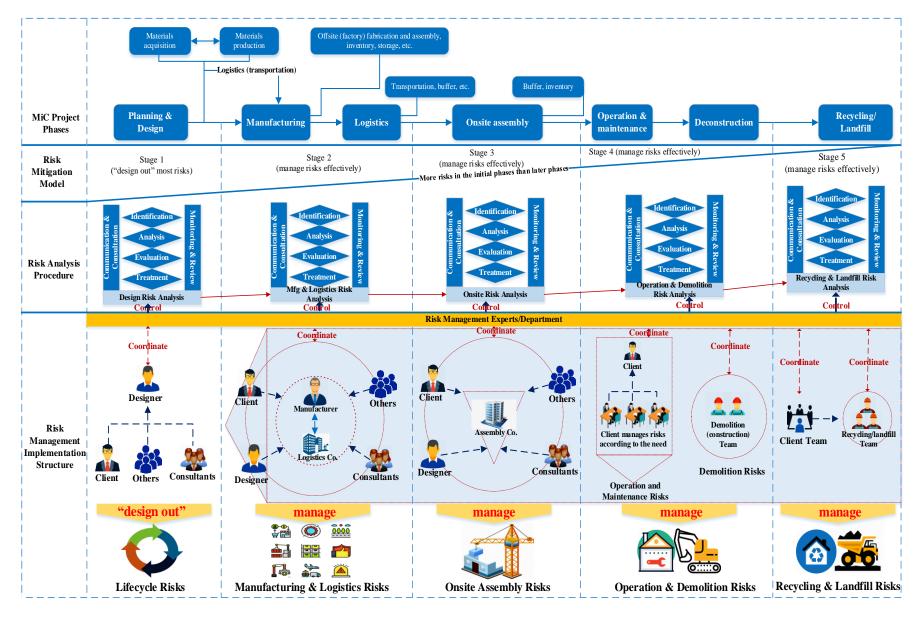
This paper has been accepted for	publication in the journal	Computers in Industry. S	bubmitted on 14 May 2020	: Accepted on 23 September 2020.
FF F	P J J			,

			BIM-AR integration for modules assembly schedule control and sequence monitoring	
Multi-phase risks	MS1	Inefficient verification of modules due	BIM-RFID integration for efficient identification and	[11]
initiation printo ribito	11101	to ambiguous labels	verification of modules	[]
	MS2	Inaccurate as-built/as-is dimensions	BIM-laser scanning integration for accurate dimensions	[76-82]
		estimation	estimation	
Universal risks	U1	Poor communication between	BIM-RFID integration for efficient communication	[11,55,60,94,95]
		stakeholders	among stakeholders	
			BIM-CCT integration for MiC supply chain management	
			BIM-based 4D simulation for managing module	
			manufacturing processes	
			BIM-AR-VR integration to facilitate communication	
			between stakeholders	
	U2	Poor integration among stakeholders	BIM automation of MiC design	[14]
	U3	Poor coordination	BIM-CCT integration for MiC supply chain management	[60]
	U4	Lack of integration of supply chain phases	BIM-CCT integration for MiC supply chain management	[60,61,69]
		-	BIM-RFID-barcode integration for MiC supply chain	
			integration	
	U5	Poor control and supervision	BIM-CCT integration for MiC supply chain management	[60]
	U6	Inefficient quality inspection	BIM-RFID integration to embed design information in	[11]
		procedures	modules for further use	
	U7	Low information interoperability	BIM-RFID integration to facilitate information sharing	[11,53]
		among different ERP systems	between different ERP systems	
	U8	Ineffective project information	BIM-RFID integration for effective project information	[64]
		management	management	

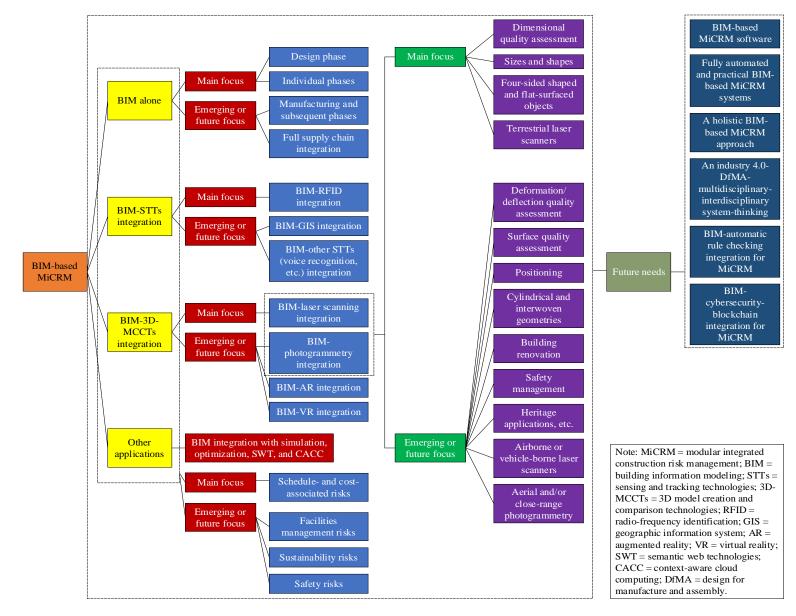
1004 1005 1006 Note: MiC = modular integrated construction; BIM = building information modeling; SWT = semantic web technologies; CCT = cloud computing technology; <math>GIS = geographic information system; JIT = just-in-time; PSOT = particle swarm optimization technology; RFID = radio-frequency identification; ERP = enterprise resource planning; <math>IOT = theinternet of things; AR = augmented reality; VR = virtual reality.

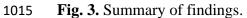


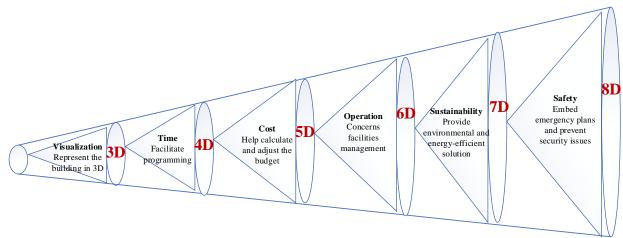
**Fig. 1.** Overview of research approach.



1012 Fig. 2. Generic MiCRM framework. Adapted from Zou et al. [20] with MiC features integrated.







**Fig. 4.** BIM dimensions.