Environmental performance of off-site constructed facilities: A critical review

3 Abstract

During the recent decades, off-site construction (OSC) has gained a rapid growth worldwide. 4 It has been reported that OSC, as an alternative construction method, has a variety of benefits. 5 6 However, there is lack of critical review of the building performance (e.g. energy consumption and carbon emissions) of off-site built facilities. Life cycle approach and 7 bibliometric analysis are adopted in this study to review existing research on the 8 9 environmental performance of off-site built facilities. The results show that most existing studies chose to employ LCA method to systematically analyse carbon emissions and energy 10 11 consumption of prefabricated residential buildings by using sub-assembly components as functional units. The detailed investigation of volumetric construction and building 12 operational stage are rare. The sensitivity of thermal property caused by offsite 13 14 manufacturing and onsite assembly in comparison to the traditional cast-in-situ method remains unexplored. It is encouraged to cover various environmental impacts in building 15 performance assessment, to develop a sustainability rating system applied in OSC, to adopt 16 Internet-of-Things in OSC monitoring by using real-time data, and to establish an indicator 17 system for the evaluation of OSC performance. The findings of this study can facilitate the 18 19 understanding of status quo and shed lights on future research direction in OSC.

Keywords: Off-site construction; life cycle approach; energy consumption; carbon emissions;
 environmental performance

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23 **1. Introduction**

Building-related energy issues have attracted global attention. According to International Energy Agency [1], the building sector contributes to approximately 40% of global primary energy consumption, with more severe situation in the developed and urbanized countries [1]. 27 Energy consumption of buildings covers not only material usage and construction equipment input, but also the operation and maintenance process. In general, electricity and natural gas 28 used for operating a building are estimated to account for more than 80% of buildings' total 29 energy consumption throughout the entire life cycle. With the consistent emphasis on green 30 technology and high-standard liveability, the role of embodied energy becomes increasingly 31 important. Embodied energy covers energy consumed during raw material production, 32 33 transportation, and onsite construction process. As a result, the erection and usage of a building is responsible for significant environmental issues, such as resource depletion and 34 35 greenhouse gas emission.

To tackle these problems, some strategies have been adopted to mitigate adverse 36 environmental loading and to improve construction efficiency in construction projects. Off-37 38 site construction (OSC) offers a new approach by producing building components in an off-39 site manufacturing factory, transporting the complete or semi-complete prefabricated products (i.e., components) into the jobsite, and finally assembling these components to 40 41 construct buildings [2]. A few interchangeable terms for OSC have been used in the literature [3], such as prefabricated construction or modular construction. According to Hong, Shen, Li, 42 Zhang and Zhang [4] and Gibb [5], there are mainly four categories of OSC, namely: (1) 43 component manufacturing and subassembly; (2) non-volumetric pre-assembly not enclosing 44 usable space; (3) volumetric pre-assembly with usable spaces; and (4) the entire modular 45 46 buildings that form the actual fabric of a building. In traditional onsite construction, raw building materials are transported and constructed on-site. By contrast, OSC moves the 47 building process from the construction sites into a controlled factory environment [6], thus 48 49 gaining advantages in cost and time saving [7, 8].

50 The performance of OSC compared to that of traditional cast-in-situ has been an ongoing 51 research theme in the domain of OSC [9]. More specifically, OSC is a time-efficient and

52 cost-saving method that achieves the sustainable construction without compromising the building shape and design. Three key objectives (i.e. quality, time, and cost) play crucial 53 54 roles in project management. From a managerial perspective, the physical quality control [10], schedule flexibility [11, 12], and economic benefits of OSC [7, 13, 14] have been extensively 55 studied from both theoretical and practical perspectives in the past decades. From a resource 56 input perspective, it is necessary to have basic elements (e.g. labour, material, equipment) for 57 58 building construction. Therefore, the labour demand, material usage, and equipment requirement are comprehensively evaluated in the prefabrication research domain [15-18]. As 59 60 an emerging technique, the corresponding innovative management methods and changes in stakeholder relationship also attracted attention from the research community [19]. In 61 addition, a vast body of work discussed the co-benefits from the implementation of OSC 62 63 technique, including waste, noise, and dust reductions [20, 21].

Apart from these advantages, OSC is considered as a modernized construction method that 64 moves towards a greener production [22, 23]. With the rising demand for high-quality 65 development, a growing number of publications put efforts to understand the knowledge of 66 the life-cycle environmental benefits of OSC. The mounting pressure of global climate 67 change abatement also urges policy makers to better understand the net environmental gains 68 by adopting the OSC technique. Therefore, it is imperative to conduct a critical review of 69 70 existing studies related to environmental performance of OSC, particularly for energy 71 consumption and carbon emission, which are the major driving factors leading to climate change. This review-based study extends previous scholarly work in OSC (e.g., Jin, Gao, 72 Cheshmehzangi and Aboagye-Nimo [9]) by targeting the critical issue of environmental 73 74 performance of OSC especially in the post-construction stages. It addresses the need for a critical evaluation of OSC from the life cycle perspective. It targets three research questions 75 in the environmental evaluation-based studies in the OSC domain related to: (1) what is the 76

77 main research scope in light of the environmental performance of off-site built facilities (e.g., volumetric verse sub-assembly; simulation verse real-time monitoring)? (2) what are the 78 limitations of these existing studies? and (3) what are the potential directions of future 79 research? Overall, this study contributes to the body of knowledge in OSC both practically 80 and theoretically. Practically, the understanding of OSC from an environmental perspective 81 can facilitate decision making to mitigate environmental burdens from the accelerated 82 urbanization in the current construction practice. Theoretically, identifying the hotspots and 83 burgeoning issues in OSC is beneficial for the future research. 84

The following sections are arranged as: Section 2 describes the methodology to undertake this review; Section 3 presents the quantitative review results; Section 4 provides an in-depth qualitative discussion to address the two of the aforementioned research questions related to the mainstream research topics and limitations of existing studies; Section 5 proposes the future research agenda and framework; and Section 6 concludes this study.

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91 2. Research method

Main databases (i.e. Web of Science and Scopus) were used to locate literature related to OSC. This is followed by a critical review of related literature. The workflow for the bibliometric search of literature related to the building performance of off-site built facilities is described in Fig.1.





Fig.1. Bibliometric search of literature related to building performance of off-site built facilities 98

99 2.1 Keywords

Keywords used to search academic databases followed the format described in Table 1. It can 100 101 be observed in Table 1 that there are two main categories of keywords (i.e., OSC and 102 building performance) that the existing studies have attempted to address. Keywords within each category are based on a "OR" relationship, meaning that the literature only need to 103 contain one of the keywords listed under each category. The "AND" logical relationship is 104 used to link the two categories to screen literature that target both categories. 105

106 Table 1. Keyword selection for bibliometric search of literature

Keyword related to OSC	Keyword related to building performance		
	measurements		
"Off-site construction" OR "offsite construction" OR	"Carbon emissions" OR "greenhouse gas" OR "Energy		
"prefabricated construction" OR "industrialized	performance" OR "Energy consumption" OR "Carbon		
building" OR "panelized construction" OR "modular	footprint" OR "Building performance" OR "Embodied		
construction" OR "tilt up construction" OR "offsite	Energy" OR "Operational energy" OR "energy input"		
construction" OR "precast construction"			

Only literature published in English was selected as the sample for the follow-up analysis. The type of literature included was not limited to journal articles but might also include conference proceedings, due to the fact that the research on building performance for off-site built facilities might still be in its early stage.

112 **2.2 Screening process**

Following the workflow described in Fig.1, the abstracts of the initially selected literature 113 114 were reviewed in order to weed out the literature (e.g., Nagy and Hajrizi [24]) which did not focus on OSC in the construction. Following the initial screening of literature, the secondary 115 116 screening aimed to exclude the remaining literature that did not focus on the energy consumption or carbon emissions of off-site built facilities. For example, despite focusing on 117 the energy saving potential for industrialized building in its retrofitting stage, Wang and 118 119 Martinac [25] did not highlight the difference between industrialized building and traditional cast-in-situ facilities, but mainly on retrofitting strategies. Other studies such as Zhang, Long, 120 Lv and Xiang [26], although with focuses on OSC or modular construction, did not examine 121 the environmental performance of OSC. In the second round of screening, these types of 122 literature were further excluded from the final literature sample. 123

124 **2.3 Review methods**

After finalizing the literature sample targeting on the energy consumption or carbon 125 emissions, the further review method should be determined, depending on the sample size. 126 127 Generally, with a larger sample of literature (e.g., over 100), a text-mining-based approach has been gaining a wider application to assist the review of a certain domain. Examples can 128 be found in adopting the science mapping approach in the domain of construction safety [27] 129 130 and public-private-partnership [28]. With a limited sample of papers in the given research topic, i.e., the environmental performance of off-site built facilities in this study, a content 131 analysis provides an effective approach to conduct a further in-depth discussion. 132

Content analysis is a systematic and replicable technique to compress a large amount of texts 133 into categorized contents based on certain explicit rules of coding [29, 30]. It enables 134 researchers to sift through a large volume of data with relative ease in a systematic approach 135 [31]. Content analysis is a useful tool to examine trends and patterns in documents [32], such 136 as the mainstream research methodology adopted to investigate the building performance of 137 off-site built facilities in comparison to that of cast-in-situ facilities. The steps and relevant 138 139 details of conducting content analysis in reviewing a relatively large sample of documents can be found in existing studies such as Bogus, Migliaccio and Jin [33]. 140

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142 **3. Results**

143 **3.1 Overall literature sample**

144 Initially a total of 148 papers were located following the searching strategy described in 2.1. Finally, a total of 43 papers were selected to undertake the content analysis. Almost all these 145 studies were published within the recent decade, with most of them published within the 146 recent five years. This indicates that the building performance of off-site built facilities is 147 becoming an emerging research topic. A recent literature review of OSC [9] showed that 349 148 OSC-based journal articles were published in the last decade. By contrast, the number of 149 studies on the building performance of off-site built facilities only accounts for a relatively 150 151 small portion. Table 2 lists a few typical examples of studies that investigate the building 152 performance between OSC and cast-in-situ facilities.

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154 Table 2. Examples of studies on the environmental performance of off-site built facilities

Study	Level of prefabrication	Type of building	Building performance	Methodology	Major findings
			studied		

Jeong, Hong, Ji, Kim, Lee, Jeong and Lee [34]	Precast concrete component named LPSRC column	Factory project	Carbon emission	Two case study projects, Web- CYCLONE simulation and equation-based methods	The alternative precast column improved project productivity and achieved cost saving, but the CO ₂ emission of the precast column was 72% higher.
Kosir, Iglic and Kunic [35]	Volumetric unit	Singular prefabricated modular container unit, and multi-unit modular office building	Heating, cooling and lighting energy performance, and daylight efficiency	Modelling and simulation according to the specifications of Slovenian modular unit manufacturer	The operational energy could be successfully reduced if the right design measures are incorporated on the level of envelope design. Singular modular units could serve as a basic design guideline.
Li, Lu, Wang, Huang, Chen and Wang [22]	Modular building	Modular prefabricated steel structure building for experimental study	Thermal performance, building performance in terms of sustainability, climate adaptability	Full-scale building model constructed for feasibility study of construction details followed by computer simulation	The two materials (i.e., high insulation panels and aerogel blankets) adopted in modular prefabricated buildings demonstrated significant energy savings superior than the current national standard.
Lim et al. (2017)	IBS (i.e., Industrialized building system) components: precast concrete	Residential building	Carbon footprint	Life Cycle Assessment to a case study residential building	The amount of carbon footprint can be minimized by replacing the raw materials used partly or entirely with materials with lower embodied energy.
Teng, Li, Pan and Ng [36]	Not specified	27 cases with mostly residential buildings	Embodied and operational	Literature review	On average, 15.6% of embodied and 3.2% of operational carbon reductions were achieved through prefabrication, as compared with their traditional base cases.
Tao, Mao, Xie, Liu and Xu [37]	Component for subassembly	N/A ¹	Greenhouse gas emission during the manufacturing stage	Real time monitoring of greenhouse gas emission during the manufacturing stage using an Internet-of- Thing (IoT) approach	The implementation of the IoT-based monitoring system in production line demonstrated its capability to allow timely monitoring and control of carbon emissions.
Tumminia, Guarino, Longo,	Whole modular building	Office building using solar	Energy performance and	Case study using life cycle assessment	The material production stage was found with the highest impact on

Ferraro,		as the main	environmental	based on a	building energy
Cellura		renewable	impacts	combination of	performance. In contrast,
and		energy		site monitoring	the operation stage only
Antonucci		source		and dynamic	accounted for 23% of the
[38]				simulation	total life cycle impacts,.
Wen,	Prefabricated	Residential	Embodied	Input-output	Compared to the cast-in-
Siong and	components	apartments	energy and	Life Cycle	situ residential buildings,
Noor [39]			global	Assessment,	the industrialized
			warming	simulation in	building reduced
			potential	Gabi software	embodied energy with a
					lower carbon emission.

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¹: The study of [37] was based on the carbon footprint of prefabricated component during its manufacturing, and was not studied in the stage of building site construction.

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It can be observed in Table 2 that these studies targeted OSC in various levels of prefabrications (e.g., component or volumetric unit), in different building sectors (e.g., residential houses), and used a variety of research methodologies. A further content analysis of the finalized literature sample is illustrated in Fig.2.

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163 **3.2 Content analysis of finalized literature sample**



Note: the total number of frequencies within each category may not the total literature sample because one study may cover multiple items within each category. For example, one single research could study both embodied energy and indoor comfort in the category named "Building performance studied".

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Fig.2. Content analysis results of the finalized literature sample studying the performance

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of OSC

171 Other operational performance examined in the existing studies, as listed in Fig.2, included acoustic constraints, climate adaptability, and health/welling. Fig.2 conveys the information 172 that more studies have targeted the whole building for the performance analysis, although 173 performance studies solely at the component level can also be widely found (e.g., [40, 41]). It 174 should be noticed that these studies focusing on the whole building analysis may not be based 175 176 on the modular or volumetric construction. Instead, the scope of performance analysis can be based on the whole building, which may be constructed by sub-assembly components. The 177 178 category of building component, as shown in Fig.2, summarizes the building element that 179 was adopted as the off-site manufactured components for the performance evaluation. It can be observed that the majority of the studies utilized the sub-assembly (e.g., wall panel, 180 precast column) as the off-site manufactured building component for the performance 181 analysis of OSC. Carbon emission and energy performance are the most common 182 environmental performance aspects that were evaluated in existing studies. The energy 183 performance could be further categorized as embodied energy, operation energy, and energy 184 in the life cycle assessment (LCA). LCA has been the most common research method to 185 examine the performance of off-site built facilities, followed by computer-based simulation 186 187 and modelling. It should be noticed that these two most widely adopted research methods are 188 not separated, but often integrated. For example, Cao, Li, Zhu and Zhang [42] adopted the Building for Environmental and Economic Sustainability (BEES) as the tool to conduct the 189 190 LCA for environmental impact of prefabricated building. Chou and Yeh [43] developed the process-based LCA Monte Carlo probability simulation to evaluate the carbon emission and 191 environmental cost of building construction. 192

4. Discussion of mainstream research and limitations

194 **4.1 Focuses of mainstream studies**

Results of the content analysis are shown in Fig.2. It can be observed that majority of existing studies have concentrated on the sub-assembly level of OSC in the residential sector, with energy performance and greenhouse/carbon as the mainstream performance indicators. The LCA and simulation are the dominating research methods than the real-time monitoring of off-site built facilities.

200 **4.1.1 The prefabrication level**

201 OSC can be categorized into subassembly, non-volumetric pre-assembly, volumetric preassembly, and modular construction according to the extent of prefabrication rate. However, 202 the major focus of environmental performance analysis in the OSC field is still at the sub-203 204 assembly level. This is mainly because sub-assembly construction method can, to some extent, take the superiority of precast construction and maintain building aesthetic values. 205 Hence, it has been more widely applied worldwide. By contrast, volumetric construction is 206 criticized by its lower aesthetic value. Besides, in comparison to a building constructed at a 207 lower prefabrication rate, volumetric construction requires additional coordination and 208 planning work due to its difficulties in logistics and building design process [44]. The high 209 initial cost also impedes the application of volumetric construction because the modules for 210 volumetric construction are built in a more integrated manner with higher completeness [7]. 211 212 As a result, the applications and studies on OSC with higher prefabrication rates are rare. However, given the importance of modular construction with due consideration of site, labor, 213 and time restrictions, it is urgent to decode the environmental complexity embedded in 214 215 buildings with higher prefabrication rates.

216 **4.1.2 Mainstream OSC applications**

The superiority of OSC in standardization allows the mass production of buildings by using 217 the standardized drawings and component, and further encourages a widespread application 218 of prefabrication in residential buildings. The reasons that more OSC studies have targeted 219 the residential sector could be partly due to the housing shortages which call for more cost-220 effective approaches to meet the public needs. Practical examples of OSC approach to meet 221 housing needs can be found worldwide such as UK [45]. The availability of the similar cases 222 223 in the residential sector motivates more research of evaluating the performance of off-site built residences. On the other hand, the backward development of prefabrication places major 224 225 challenges for investigating prefabricated buildings with volumetric construction given the barriers of cost and technology. As a result, considerable amount of studies has focused on 226 sub-assembly components. More specifically, given the prefabrication is still in its early stage, 227 228 local government or developers prefer to control prefabrication rate to seek the balance between advanced technology implementation and building cost [4], thereby minimizing the 229 case of volumetric pre-assembly, especially high-rise volumetric buildings. This is 230 particularly the case for these located in the areas with adverse geological and weather 231 conditions and with high demands on production quality and assembly techniques. 232

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4.1.3. Mainstream performance indicators

Data are the core factor affecting the scope, focus, and accuracy of prefabrication-related 234 studies. These mainly include three sub-factors, namely, data availability, data accessibility, 235 236 and data quality. Most prefabricated buildings in developing countries (e.g., China) are still under construction or in its operational phase. Therefore, there is lack of sufficient 237 demolition-related data for in-depth analysis. Due to the commercial and confidential reasons, 238 239 developers, suppliers, and contractors are unwilling to share detailed inventory data during building construction phase, and that restricts the data accessibility for the public and 240 research committee. Therefore, the case study approach is dominating in prefabrication-241

related studies with process-based LCA as the major underlying method. However, such 242 case-by-case investigation reduces the comparability among different counterparts due to 243 variations in methodological assumption, data source, as well as temporal, geographic, and 244 technical representativeness. Moreover, although precast construction emphasizes the precise 245 production in the off-site manufacturing factory, data collected through the entire supply 246 chain still suffer from different levels of uncertainty. Therefore, in addition to the quantitative 247 248 simulation, qualitative analysis (e.g., descriptive story-telling) still plays a critical role in prefabrication studies. 249

250 The drawbacks in data quality and availability related to OSC performance have caused existing studies largely adopting simulation, LCA, or qualitative studies using cases. These 251 performance indicators are so far largely limited to energy and carbon emission. That could 252 253 be explained by the facts that: (1) several existing building sustainability rating system such as LEED as shown in U.S. Green Building Council [46] assign more weighting to these two 254 main assessment criteria; (2) These two indicators or assessment criteria can be more easily 255 simulated in existing software tools, such as IES [47]. However, it is worth noting that some 256 other emerging rating systems of building sustainability have drawn a growing level of public 257 attention, e.g., WELL [48]. These emerging rating tools cover a variety of other indicators 258 including indoor health and well-being. Therefore, the performance indicator for off-site built 259 facilities could turn out more comprehensive especially by covering indicators related to 260 261 human health and well-being.

262 **4.2 Limitations of existing studies**

263 The main scope of these existing studies also yield several limitations.

264 4.2.1 Limitations in research methods

Although sufficient studies have been undertaken on specific prefabricated components and their roles in the whole building, the detailed investigation of volumetric construction,

including volumetric modular and volumetric buildings, is still rare. As highlighted by [37], 267 most previous studies targeting the carbon emissions of construction projects have been 268 limited to emission prediction before construction or quantitative analysis following 269 construction. There have been limited real-time monitoring system to capture the on-time 270 data of building performance. Further extending from the statement of [37], most studies on 271 the performance of off-site built facilities have been based on the LCA approach or 272 273 computer-based simulation, but with limited work performed to capture the real-time data of building performance. The traditional LCA or simulation approach could generate certain 274 275 degree of uncertainty, and needs to be validated with real-time data from site monitoring. Lack of actual operational data from existing prefabricated buildings can be found in recent 276 studies (e.g., [34, 49]). Data source and the corresponding data quality are major barriers to 277 278 enhance the implications of findings on the performance of OSC projects [50].

Given the high prefabrication rate and large volume of modular units, the volumetric construction exhibits large challenges to the off-site manufacturing, logistic, onsite assembly, operation, and demolition processes in terms of technical and managerial aspects. Therefore, it is suggested to conduct experimental studies to make an in-depth analysis of life cycle environmental performance of this specific prefabrication unit.

284 **4.2.2** Limitations in building project phases

Most studies in the prefabrication field concentrate on the building embodied phase, covering the off-site manufacturing, transportation, and onsite assembly processes. However, restricted by the infancy stage of prefabrication, there are few studies on the environmental performance of building operational and demolition phases. More specifically, thermal test needs to be further enhanced to examine the environmental impacts during the operational phase of prefabricated buildings. The sensitivity of thermal property caused by offsite manufacturing and onsite assembly in comparison to the traditional cast-in-situ method 292 remains unexplored. Some scholars have targeted in this specific field. Aye, Ngo, Crawford, Gammampila and Mendis [51] demonstrated that there were no obvious energy reduction 293 benefits by using prefabrication techniques during building operation. Zhu, Hong, Shen, Mao, 294 Zhang and Li [49] considered the advantage of prefabricated buildings in thermal 295 performance improvements from the enhanced air tightness and material substitution. The 296 findings revealed that prefabricated buildings exhibited greener attributes when compared to 297 298 traditional buildings. In addition, given the large saving potential in the demolition phase of this innovative construction method [52], the lack of case studies on the demolition phase 299 300 may cause the misinterpretation of life cycle environmental performance of prefabricated buildings. 301

302 **4.2.3** Limitations in environmental impact assessment

303 Besides carbon emission and energy consumption, other types of environmental impacts, 304 such as global warming, ozone exhausting, and water consumption have not been considered in the existing studies. Indeed, a systematic analysis is required to provide a holistic map of 305 environmental benefits from the prefabrication approach. Cao, Li, Zhu and Zhang [42] 306 conducted an indicative study of a prefabricated building based on the attributional LCA. The 307 findings demonstrated that differing from the conventional construction method, the precast 308 construction could generate a wide range of environmental impacts involving the ecosystem 309 310 damage, resource depletion, and health damage. A holistic picture of the performance of 311 prefabricated facilities involving multiple measurement indicators (i.e., carbon emissions and energy consumption) would be needed in order to promote the application of OSC approach 312 in the industry. 313

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317 **5. Future research directions**

A critical review of these existing studies indicates that following areas could be further investigated, namely adoption of existing sustainability rating system into OSC, IoT applications in OSC, and a comprehensive indicator system for OSC performance incorporating the Big Data approach.

322 5.1 Sustainability rating system applied in OSC

Sustainability rating systems, including but not limited to LEED [46], BREEAM [53], and 323 Green Star [54], could be adopted for OSC projects in different structural forms (e.g., 324 325 modular container, timber frame, etc). Although OSC is inherently linked to sustainability [55], existing studies have not paid sufficient attention to the sustainability and lean features 326 from OSC [56]. Furthermore, these sustainability rating systems have not been found widely 327 applied in assessing the performance of OSC projects. The question remains to be answered, 328 e.g. are all these existing ratings systems applicable to OSC projects? For example, OSC is 329 expected to reduce the wastes and improves the on-site sustainability performance along with 330 the reduced site work. However, more efforts are required in the off-site manufacturing and 331 other pre-construction stages. It remains unclear whether the existing rating systems can be 332 seamlessly utilized to evaluate the sustainability performance of OSC projects. Pilot projects 333 can be undertaken and monitored from the LCA approach to explore the applicability of 334 existing rating systems. These experimental and explorative tests would also lead to further 335 336 studies on whether there is a need to adopt an updated version of sustainability rating specifically for OSC projects, differentiated from the conventional site-built facilities. 337 Similarly, such rating system should consider both new-built and renovation of existing 338 339 buildings. The reuse of prefabricated components did not receive adequate attention when evaluating the environmental performance. 340

342 **5.2 IoT application in OSC monitoring**

IoT aims to enhance the world connection by enabling the integration of things in both 343 physical world and cyber space [57]. It generates a diversity of datasets assisted by the great 344 number of wireless sensor devices [57]. IoT covers the emerging digital technologies that are 345 being applied in the construction industry, including BIM, virtual reality, and augmented 346 reality, etc. Mao, Tao, Yang, Chen and Liu [58] proposed an IoT-based system framework 347 that could integrate a distributed sensor network to collect real-Time emissions data 348 accompanied a BIM-based virtual model to monitor the emissions status of different 349 350 construction activities. Tao, Mao, Xie, Liu and Xu [37] moved a step forward to implement the greenhouse gas (GHG) emission monitoring system based on IoT to enable the real-time 351 monitoring of GHG emission during the manufacturing stage of prefabricated components. 352 353 Application of IoT-based technological system in OSC real-time monitoring is in the early stage, and could be further extended from the pre-construction to operation stages. Latest 354 smart technologies would allow the remote control and monitoring the OSC facilities in an 355 "in-house cloud". These technologies would enable the OSC performance data collection, 356 filtering, analytics, interpretation, and storage for prediction and optimization purposes of 357 future OSC facilities in a similar scenario. 358

5.3 An indicator system for the evaluation of OSC performance

Studying the performance of off-site manufactured buildings has been gaining the momentum in recent years. Practically, stakeholders are concerned of multiple indicators of OSC performance, such as the cost, quality, and post-construction building performance, etc. Existing studies have not been investigating the different performance indicators of OSC, such as energy performance [38], carbon emission [36], and other engineering properties [59]. A comprehensive indicator system to evaluate the building performance of OSC by incorporating cost, energy efficiency, carbon footprint, indoor health and wellbeing, and 367 other measurements would be insightful to shed light on the understanding of OSC performance, based on the comparison to the conventional site-built facilities. The structural 368 forms of OSC vary, e.g., timber frame, precast concrete, and modular container. Big Data 369 370 approach has displayed its potential in construction industry, such as construction waste management [60, 61]. OSC remains its infancy stages in several developing economies such 371 as China [4]. As a result, the Big Data approach may not be immediately feasible for the 372 performance analysis of OSC projects. Nevertheless, the potential of Big Data in being 373 applied in the OSC performance evaluation through the site monitoring and data collection. 374 375 The experimental approach of site-built OSC facilities could be one of the research methodologies to analyze the gap between simulation and actual performance that is 376 monitored on-site. In recent years, the emerging "Living Lab" concept [62] could fit the OSC 377 378 technique by building site building units for academic research and public outreach. The "Living Lab" could also bridge the academia and industry by sharing the building 379 performance data monitored on-site. It also allows the trial of different modular building 380 381 components that fit into the OSC technique, e.g. off-site built foundation system, wall panels, and green roof panels, etc. 382

Following the discussion of limitations associated with existing research, a framework is proposed for the future studies (Fig.3). This framework incorporates the sustainability rating, loT, performance indicator system, and the knowledge base. Amongst these critical components, knowledge base was defined by GhaffarianHoseini, Zhang, Nwadigo, GhaffarianHoseini, Naismith, Tookey and Raahemifar [63].



Fig.3. Research framework for continuing the scholarly work of developing the knowledge
base for prefabricated buildings

According to GhaffarianHoseini, Zhang, Nwadigo, GhaffarianHoseini, Naismith, Tookey and Raahemifar [63], LCA approach should be adopted to control the energy efficiency especially the post-construction stage which accounts for a high proportion of the total energy consumption. The Integrated Knowledge-based Building Management System adopting multi-dimensional BIM proposed by GhaffarianHoseini, Zhang, Nwadigo, GhaffarianHoseini,

Naismith, Tookey and Raahemifar [63] is for general construction. Such integrated approached could be further extended to the context of prefabricated buildings, meanwhile inheriting the standardized and dynamic features of this system. Existing OSC projects could be adopted as cases to implement the framework of Integrated Knowledge-based Building Management System using nD BIM applications (e.g.[64]), which emphasizes the energy performance of facilities in the post-construction stages.

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404 **6. Conclusions**

Off-site construction has drawn wide attention in last decades due to its benefits such as cost savings, time savings, better quality and higher level of safety performance. Similarly, offsite construction has gained rapid growth as it helps to reduce the environmental impacts, e.g. dust and waste. However, there is lack of systematic review of environmental performance of off-site built facilities.

This study critically reviewed the literature related to off-site construction, especially in terms of environmental performance. The review uncovered the mainstream studies on environmental performance assessment of prefabricated buildings. Most existing studies chose to employ LCA method to systematically analyse carbon emissions and energy consumption of prefabricated residential buildings by using sub-assembly component as the functional unit.

It was found that other environmental impacts (e.g. global warming, ozone exhausting and water consumption) received less attention. Similarly, the existing body of knowledge mainly concentrated on manufacturing and construction stages of off-site built facilities. On the contrary, the operation and end-of-life stages were largely overlooked. The major challenge lies in the difficulty to acquire data in operation and end-of-life stages, especially real-time

data. Indeed, system boundary and data accuracy present most significant challenges for the
evaluation of environmental performance of off-site built facilities.

Based on the critical review of related literature, an agenda is developed for the future research in off-site built facilities (Fig.3). There are three directions of future research, i.e. sustainability rating system applied in OSC, IoT application in OSC monitoring, and an indicator system for the evaluation of OSC performance. These provide useful references for future studies in off-site construction.

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