1 2	Towards a Decision Support for Modular Integrated Construction: An Integrative Review of the Primary Decision-Making Factors
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Please Cite As: Wuni, I.Y. and Shen, G.Q. (2019), "Towards a decision support for modular integrated construction: an integrative review of the primary decision-making actors", International Journal of Construction Management, Taylor & Francis, Vol. Early Cite No. Early Cite, pp. 1–20.

Towards a Decision Support for Modular Integrated Construction: An Integrative Review of the Primary Decision-Making Factors

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6 **ABSTRACT**:

7 Where circumstances merit and favourable conditions prevail, modular integrated 8 construction (MiC) becomes a superior choice of construction method over the 9 traditional approach. For many types of buildings, MiC is becoming a preferred 10 alternative to traditional construction. However, the decision to use MiC must be made after critical analysis because several key factors and conditions need to 11 12 converge to make MiC economical and feasible. As a result, this research conducted a systematic review of the determinant factors in deciding to use MiC in 13 14 a project. The literature analysis identified 51 decision-making factors (DMFs) for implementing MiC. Of these, the top 5 most cited DMFs include availability of 15 skilled and experienced factory labour force; availability of skilled management 16 17 and supervising team; demanding and tight project schedule; transport infrastructure, size restrictions, and equipment availability; and need for improved 18 construction safety. The study proposed a conceptual framework for the identified 19 20 DMFs consisting of labour considerations; project characteristics; location and site 21 attributes; and organizational factors. A stage-gate model is proposed to 22 demonstrate the MiC implementation decision-making process. Thus, the paper 23 contributes to a better theoretical and practical understanding of the primary DMFs 24 for implementing MiC and will help to maximize benefits and minimize risk.

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Keywords: decision support system; determinant factors; decision-making factors; modular
 integrated construction; review

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29 **Wordcount**: 10,493 + Title + Abstract + Keywords

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31 32

33 Introduction

Off-site construction (OSC) is a construction technique involving the planning, design, 1 2 production, and assembly of building components at a location other than their final installed 3 location to support the rapid and efficient construction of structures (Goodier and Gibb 2007). 4 Modular integrated construction (MiC) is an innovative OSC method where building components are built in an assembly line in a factory, trucked to a job site in modules (sections), 5 6 set in place with crane (s), and then joined together to form a complete building (Wuni et al. 7 2019a). MiC is the most complete form of OSC involving the greatest integration of factory-8 made value-added prefabricated prefinished volumetric modules (Pan and Hon 2018). Where 9 circumstances merit and favourable conditions prevail, an effectively implemented MiC shortens 10 construction time, reduces construction waste, reduces carbon emissions, improves and controls 11 construction quality, improves working environment, reduces site labour requirement, improves 12 productivity, and reduces whole life cost (McGraw Hill Construction 2013; McKinsey Global 13 Institute 2017; Arcadis 2018; Construction Industry Council 2018).

14 For many types of buildings, MiC is increasingly becoming a preferred alternative to the 15 traditional method in the construction industry (Hwang et al. 2018). However, one major 16 challenge during the conceptual stage of a project is ascertaining the conditions and factors that 17 make MiC the best choice in delivering value for money whiles meeting specific project 18 objectives (Murtaza et al. 1993; Azhar et al. 2012). This is crucial because not all circumstances 19 and conditions merit the implementation of MiC in a project (Song et al. 2005). For instance, the 20 MiC technology offers profound improvements in construction projects with repetitive design 21 such as student residences, estate apartments, hotels, prisons, and hospitals (Mao et al. 2016). 22 MiC may also be a superior choice for projects in remote locations with harsh weather conditions 23 and climate where construction labour with the requisite knowledge and skills is not readily 24 available or just too expensive to warrant traditional construction (Rentschler et al. 2016). 25 However, traditional construction may be the best choice for a project where there is the 26 availability of skilled and experienced labour in a construction site which is considered routine.

Therefore, the decision to implement MiC in a project should be reached only after a systematic and critical analysis because several key factors and conditions need to converge to reap the full benefits of the MiC technology. Yet, the decision to implement MiC in a project in most cases is not well-informed and systematically guided. Meanwhile, the business model of

1 MiC encapsulates a complex combination of multidimensional knowledge requirements, 2 systems, and process (Koskela and Ballard 2003). As such, there is always a risk that a wrong 3 decision becomes a recipe for the poor performance of a project or its total failure (ibid). As a 4 result, developers, construction clients, contractors, and engineers require detailed analyses of 5 the determinant factors during the feasibility and economic analyses to ascertain the 6 compatibility of the MiC with their projects, prior to making a final decision to use the approach 7 in a project (Hwang et al. 2018). This is necessary and critical to the successful management of 8 the early stages of the MiC project lifecycle because empirical evidence of project performance 9 has consistently demonstrated that ultimate project success and failure start with the management 10 decisions at the early part of the project lifecycle.

11 Meanwhile, decision-making in the context of the complex requirements and often competing 12 project objectives during the conceptual stage of a project are possible and feasible with 13 computer-aided decision support systems, tools, frameworks and expert systems (Murtaza et al. 14 1993; Hwang et al. 2018). For instance, knowledge-based decision support systems (KBDSS) are 15 designed to allow practitioners to increase the planning rigor, stakeholder participation, and 16 provide a sound basis for a structured decision making (Schwartz et al. 2018). KBDSS integrate, 17 codify and transform specialist expertise and information into coherent frameworks and tools for 18 structured decision making under complex environments (Sullivan 2002; Stoeckl et al. 2016). 19 However, KBDSS require in-depth knowledge of the decision-making factors (DMFs). Although 20 these DMFs are sensitive to project types, sites, objectives, and territories, many of the key 21 decisions in MiC projects are similar in structure (Murtaza et al. 1993). As MiC has gained 22 significant attention in the engineering, procurement, and construction (EPC) industries, a deeper 23 knowledge and common framework of the DMFs for MiC decision support is imperative.

Despite their significance in improving the success of MiC projects, existing OSC reviews have seldom addressed the DMFs for MiC decision support. This research attempts to address the knowledge gap and contribute to the MiC implementation discourse through a systematic review of the DMFs for MiC decision support. Concomitant objectives of the review are: (i) to identify the DMFs for MiC decision support, (ii) to summarize, integrate and rank the DMFs for MiC decision support, and (iii) propose a conceptual framework of the DMFs in the implementation of MiC. The output of this research has useful theoretical and practical

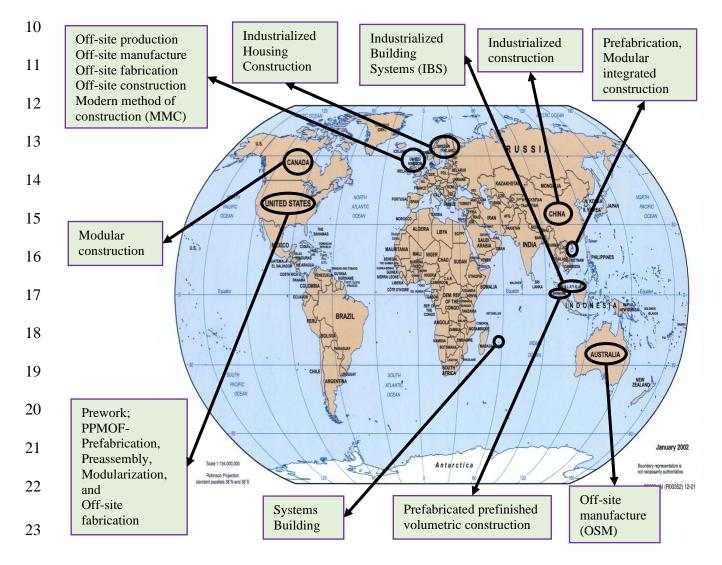
significance. Theoretically, this study constitutes the first exclusive review of the DMFs for MiC 1 2 decision support in the literature and generates a useful checklist of the DMFs for MiC. 3 Practically, the framework of the DMFs for MiC decision support will be beneficial to 4 construction managers, engineering managers, operation managers, project control managers, 5 construction site managers, project engineers, projects managers, clients and developers in 6 determining when to use MiC in a project. The rest of paper is organized as follows. The next 7 section offers a brief background to MiC, followed by a description of the research methods and 8 approach adopted. The review findings are then presented and discussed and finally, conclusions 9 and future research directions are provided.

10 Background and overview of modular integrated construction

11 MiC is an innovative construction method and a production process where free-standing 12 prefabricated prefinished integrated modules, usually completed with finishes, fixtures, and 13 fittings are manufactured in an assembly line in a factory, trucked to a job site in modules 14 (sections), set in place with crane (s), and then joined together to form a complete building 15 (Construction Industry Council 2018; Wuni et al. 2019a). The manufacturing and assembly of 16 the building components occur in an accredited off-site fabrication factory in accordance with 17 approved design codes and accredited fabrication method (Hwang et al. 2018). A module 18 constitutes a building unit or component of the entire modular system (Gosling et al. 2016). A 19 module refers to the independent building components having standardized interfaces with other 20 parts of a building which can be integrated through the pre-planned interfaces (Baldwin and 21 Clark 1997; Peltokorpi et al. 2018). The interfaces contain detailed preestablished engineering 22 specifications of how to resolve potential conflicts between interacting modules (Baldwin and 23 Clark 1997; Baldwin and Clark 2000). Essentially, modules are the basic building blocks of an 24 MiC project which are designed to be structurally independent of one another but still function 25 together as an integrated whole (Baldwin and Clark 2000; Gosling et al. 2016).

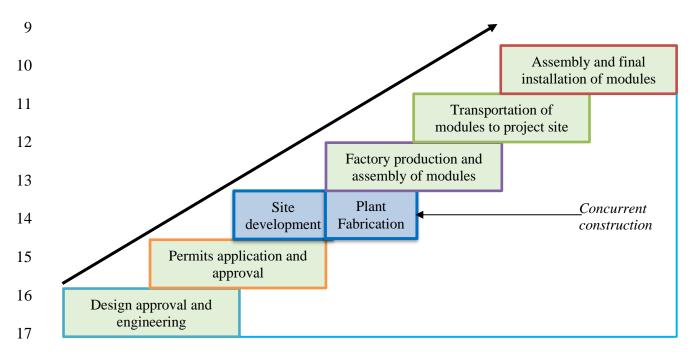
MiC incorporates the concepts of modularity and modularization into the building construction process. Bohn (2016) described modularity as the degree to which discrete, standardized components of a whole system can be assembled in different configurations to offer diverse options and flexibility in the final product. Modularity is an engineering concept which describes the extent to which modules can be fabricated independently, mixed and matched

1 variously to offer flexibility and diversity of uses (Baldwin and Clark 1997). On the other hand, 2 modularization refers to the systematic disintegration of a complex system (building) into 3 discrete components (modules) which interact with each through standardized interfaces, rules, and specification (Gosling et al. 2016). According to Gibb (2001), the varying degrees of 4 5 modularization in MiC include component manufacture and subassembly, non-volumetric 6 preassembly, volumetric preassembly, and completely assembled modular building. MiC is 7 considered the highest order of prefabrication and the most complete form of OSC involving the 8 greatest integration of value-added factory-made prefabricated prefinished volumetric modules 9 (Pan and Hon 2018).



24 Figure 1. World map of the off-site construction techniques

1 MiC shares many similarities with other OSC techniques such as prefabricated prefinished 2 volumetric construction, industrialized building systems, modular construction, and prework. 3 Figure 1 shows a geospatial map of the OSC techniques. The general schedule of the MiC 4 approach comprises project design, permits, and statutory approval, production of modules, 5 transportation of modules to site, on-site installation of modules and site restoration (Modular 6 Building Institute 2017; Construction Industry Council 2018). Figure 2 shows the major stages in 7 the modular integrated construction process. The three main forms of MiC include reinforced 8 concrete modules, steel frame modules, and hybrid modules.



18 **Figure 2**. Stages of the modular integrated construction process

19 MiC is an example of the Design for Manufacture and Assembly (DfMA) philosophy; a 20 design approach that focuses on the ease of fabrication and efficiency of modular assembly 21 (Construction Industry Council 2018). DfMA combines the methodologies of both Design for 22 Manufacture (DfM) and Design for Assembly (DfA). The former involves designing for the ease 23 of fabricating modular components and concerned with the selection of the most cost-effective 24 materials and processes to be used in minimizing the complexity of modular production 25 operations whereas the latter involves designing the modules for ease of assembly and concerned 26 with minimizing modular assembly cost and the number of assembly operations. DfMA operates 27 on the principle that if the design of the modules can be simplified, then it is possible to 28 efficiently manufacture and assemble the modular components within schedule and at a lower

cost. Thus, DfMA offers the merit of speed, lower assembly cost, higher quality, shorter
 assembly time, increased reliability and safety in MiC projects.

3 Unlike the strict linear sequence of design, engineering, and construction associated with the 4 stick-built construction approach, MiC tolerates the concurrent execution of construction trades 5 (Peltokorpi et al. 2018). As such, it reduces the construction duration and improves productivity 6 (McKinsey Global Institute 2017). However, the smooth implementation of MiC requires 7 extensive coordination of the MiC supply chain and involved stakeholders, prior to and during 8 the construction process (Hwang et al. 2018). Several factors and conditions are relevant to the 9 successful implementation of MiC. Accuracy of the modular design and timely design freeze is 10 required prior to the fabrication of modules (Gibb and Isack 2003). Considering that the modules 11 are often designed to be used in a specific project and usually made-to-order, scheduling must be 12 configured to ensure that the optimum quantity of each module is produced to avoid wastage 13 following completion of the project (Hsu et al. 2018). Success of MiC projects also depends on 14 good working collaboration, effective communication, and information sharing among MiC 15 project participants (Haas and Fagerlund 2002; Li et al. 2018). These unique considerations and 16 processes require effective decision making during the conceptual stage of a project, reinforcing 17 the need for this study.

18 **Research methods and approach**

19 Research design adopted

20 The primary aim of the study is to identify, appraise, and summarize the relevant decision-21 making factors (DMFs) required to develop decision support for MiC. This involves the analysis 22 of relevant qualitative and quantitative studies with diverse theoretical and methodological 23 underpinnings (Whittemore and Knafl 2005). To achieve this, the study adopted an integrative 24 systematic review design which offers a framework for synthesizing and drawing conclusions 25 from past studies with diverse research designs (Whittemore and Knafl 2005; Torraco 2016). The 26 research design also provides a framework for identifying important issues that research has left 27 unresolved. Although previous reviews (Wuni et al. 2019a; Wuni and Shen 2019) have used 28 meta-synthesis and systematic reviews to integrate qualitative and quantitative findings, such 29 designs are best used for either synthesizing solely quantitative or quantitative studies (Webster 30 and Watson 2002). Particularly, an integrative review constitutes a systematic review

1 methodology deployed when meta-analysis and traditional systematic reviews are inappropriate 2 to address a given research problem (Whittemore and Knafl 2005; de Souza et al. 2010). 3 According to de Souza et al. (2010), integrative review is a systematic review design which 4 emerged to address the illegitimacy of drawing conclusions from studies with diverse research 5 designs and methods. As such, this study adopted integrative review as the research design based 6 on a five-stage systematic review process comprising research protocol development, database 7 selection, literature search, study selection, and data extraction, synthesis, and presentation.

8 Database selection and literature search strategy

9 A rigorous and comprehensive systematic review study must draw on the findings from a 10 substantial number of past research, which is often facilitated through searching multiple 11 literature databases (Baker 2016). Some of the powerful construction engineering and 12 management (CEM) literature databases, search engines, and libraries include Scopus, Google 13 Scholar, Web of Science, Engineering Village, Science Direct, ASCE library, Taylor and 14 Francis, and Emerald Insight (Wuni et al. 2019a; Wuni and Shen 2019). However, Wuni et al. 15 (2019b) noted that the same research articles are often contemporaneously indexed in these 16 literature databases. Thus, it is imperative to select the appropriate databases which could offer a 17 wider retrieval of the relevant literature and allows for repeatability. Preliminary searches in the 18 databases using the keywords "off-site construction" OR "modular construction" highlighted the 19 superior performance of Scopus and Web of Science. As a result, these two were relied upon in 20 the literature search process. Prior to the actual search, the researchers specified the relevant 21 keywords (which were refined throughout the study period) for the literature retrieval. Using the 22 representative and adequate keywords in the search protocol is crucial because the abstraction 23 and indexing process of each literature database relies on these keywords (Whitehead 2013). 24 Two sets of keywords were defined to retrieve studies addressing the DMFs in the context of 25 MiC. Drawing on the precedents of Wuni et al. (2019a), the full search algorithm was developed 26 as:

TITLE-ABS-KEY (decision OR "decision support" OR choice OR selection OR comparative
OR comparison OR determin* OR drivers OR "success factors" OR "critical factors" OR "few
key areas" OR "key result areas" OR reasons) AND TITLE-ABS-KEY ("offsite construction" OR
"off-site construction" OR "offsite production" OR "off-site production" OR "off-site

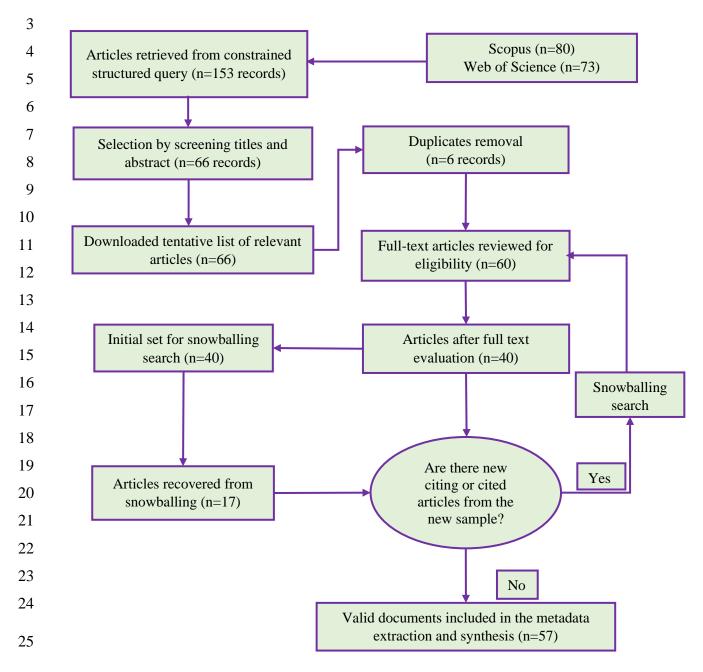
manufacturing" OR prefabrication OR prefabricated OR pre-fabricated OR "off-site
 fabrication" OR "industrialized building" OR "modular construction" OR "modular integrated
 construction" OR "modern method of construction" OR "prefabricated prefinished volumetric
 construction" OR "industrialized construction" OR "Industrialized housing") AND LIMIT-TO
 (DOCTYPE, "ar") AND LANGUAGE ("English").

6 This search algorithm was saved and re-executed in both Scopus and Web of Science during 7 the beginning, middle and prior to submission. To restrict the retrieved studies to publications 8 most relevant to the research topic, several search filters were used. This was necessary 9 considering the large corpus of research literature on OSC and MiC. In the search algorithm, the 10 Boolean concatenator "AND" filtered published documents containing at least a keyword from 11 each of the two sets of keywords. The algorithm also filtered publications in the English 12 language only and mainly *journal articles* "ar". The search was repeated immediately prior to submission to retrieve recently indexed studies. The last search was conducted on 27th June 13 14 2019. The researchers conducted a rapid screening of the titles and abstracts of the retrieved 15 studies for their relevance. The relevant documents were download and given a full-text 16 evaluation for eligibility. The researchers also deployed the snowballing search strategy to 17 retrieve other relevant studies outside the catchment of the specified keywords. To achieve this, 18 citations (citing articles) and references (cited articles) of the shortlisted algorithm-driven 19 retrieved publications were searched for further relevant studies using ISI Web of Science and 20 Scopus search engine.

21 Study inclusion and exclusion criteria

22 Following the rapid screening of the titles and abstracts of the downloaded articles, duplicates 23 were removed, and the articles were given a full-text evaluation. Although the rapid screening 24 was the first attempt at including and excluding some studies from the review, such a cursory 25 approach was not adequate to justify final inclusion and exclusion (Wuni et al. 2019a). During 26 the full-text evaluation, the authors included studies which met the following criteria: (i) journal 27 and conference papers based on empirical studies on the DMFs for an MiC decision support 28 system and (ii) published in a peer-reviewed journal or top-rated conference proceeding. As 29 such, the study excluded monographs, review articles, conference reviews, short surveys, 30 conceptual papers, discussions, and unpublished/grey literature. These were excluded because

they do not receive rigorous peer-review prior to publications. Figure 3 shows the articles
 selection process.





The authors further conducted a general Google search to identify relevant industry reports and Ph.D. theses which addressed the determinant factors in deciding to use MiC. Table 1 shows a bibliographic summary and reference numbers of the included studies.

30

1 2

Ref#	Citing source	Ref#	Citing source
1	Construction Industry Institute (1992)	30	Elnaas (2014)
2	Murtaza et al. (1993)	31	Mostafa et al. (2018a)
3	Mao et al. (2014)	32	Hwang et al. (2018)
4	Liu et al. (2017)	33	Haas and Fagerlund (2002)
5	Wong et al. (2017)	34	Song et al. (2005)
6	Clement (1989)	35	Blismas et al. (2005)
7	Murtaza and Fisher (1994)	36	Koskela and Ballard (2003)
8	Polat (2008)	37	Blismas (2007)
9	Azhar et al. (2012)	38	Scofield et al. (2009a)
10	Azhar et al. (2013)	39	Pan et al. (2012)
11	Azman et al. (2013)	40	Bohn (2016)
12	Elnaas et al. (2013)	41	Rentschler et al. (2016)
13	Gibb and Isack (2003)	42	Choi et al. (2019a)
14	Hjort et al. (2014)	43	Fenner et al. (2017)
15	Choi (2014)	44	Choi et al. (2019b)
16	Carriker and Langar (2014)	45	Scofield et al. (2009b)
17	Fraser et al. (2015)	46	Gibb (1999)
18	Choi et al. (2016)	47	Pan and Sidwell (2011)
19	Lee and Kim (2017)	48	Zakaria et al. (2018)
20	Elnaas et al. (2018)	49	Mostafa et al. (2018)
21	Gao et al. (2018)	50	Triumph Modular Corporation (2019)
22	Peltokorpi et al. (2018)	51	Lessing and Brege (2017)
23	Sharafi et al. (2018)	52	Lau (2011)
24	Pan et al. (2007)	53	Wong et al. (2018)
25	Pan et al. (2008)	54	McGraw Hill Construction (2011)
26	Tam et al. (2007)	55	Bataglin et al. (2017)
27	Chen et al. (2010)	56	Hammad et al. (2019)
28	Rahman (2014)	57	Pan and Hon (2018)
29	Zhai et al. (2014)		

3 **Table 1.** Bibliographic summary and reference numbers of the included studies.

4 Literature analysis

5 A pre-defined data extraction sheet was developed to record the metadata of each article. The 6 extraction sheet contained the independent data to be extracted from each article. The sheet 7 contained sections for the year of publication, journal or conference of publication, country of 8 study, survey instrument, reported DMFs, and target project. Discrepancies or missing data were 9 discussed between the authors and resolved. Based on the recommendations of Webster & 10 Watson (2002), the authors developed an Excel sheet known as concept matrix augmented with 11 units of analysis to organize the DMFs. Each DMF constituted the primary unit of analysis in the 12 study. Thus, the concept matrix recorded each reported DMF against the citing article. In this

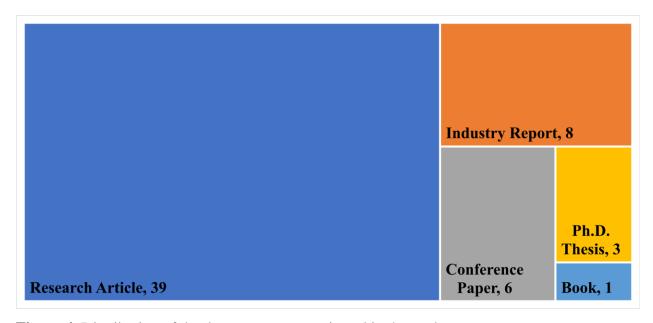
way, the number of times each DMF was cited in the literature was computed and formed the basis for ranking the DMFs. The resulting data were analysed in two sections. Tables and charts were used to report preliminary data such as the bibliographic summary of the included studies, geospatial distribution of the studies, and target projects. Frequency ranking was used to ascertain the critical DMFs in the literature. A conceptual framework was developed to organize and cluster the DMFs in the adoption of MiC and stage-gate model was finally proposed to demonstrate the decision-making process in MiC implementation.

8

9 Review findings, analysis, and discussions

10 Overview of the reviewed published studies

It is necessary to describe the characteristics and distributions of the included studies in a systematic review to highlight their quality, representativeness and relevance (Wuni et al. 2019a; Wuni and Shen 2019). The study synthesized findings from fifty-seven (57) empirical studies on the determinant factors in deciding to use MiC in a project. These studies comprised research articles (68.4%), conference papers (10.5%), industry reports (14.0%), Ph.D. Theses (5.3%) and a book (1.8%) (See Figure 4).



17

18 Figure 4. Distribution of the document types reviewed in the study

Although previous review studies have relied on mainly research articles (Wuni et al. 2019a),
this study included several other document types to capture the DMFs from a diverse

perspective. It is recognized that industry reports most often lack methodological rigor, but such industrial findings tend to offer more practical indications than most academic research articles. Additionally, considering that this study constitutes a scoping review, the sample size (57) compares favourably against samples in previous review studies (Wuni et al. 2019a; Wuni and Shen 2019). The inclusion of diverse documents could only compromise the cited ranking of the DMFs but will provide a more comprehensive set of the determinant factors in deciding to use MiC in a project.



9 **Figure 5**. Annual publications trend on DMFs for MiC in a Project

10 The reviewed studies covered three decades spanning from 1989 to 2019. Figure 5 shows the 11 annual publications trends on the DMFs. This year ranged covered the last decade of the 20^{th} 12 century and the first two decades of the 21st century; the periods which marked a significant 13 renaissance of the offsite construction revolution (Gibb 1999; Wuni and Shen 2019). Thus, the 14 findings of the study provide a longitudinal perspective of the earliest and most recent 15 determinant factors in deciding to use MiC in a project which reflects the core tenets of an 16 integrative systematic review (Whittemore and Knafl 2005; de Souza et al. 2010). From Figure 17 5, the first 1 decade (1989-1999) recorded an annual publication average of 1 article. This was 18 expected because the same period marked the early renaissance of the MiC technique. During

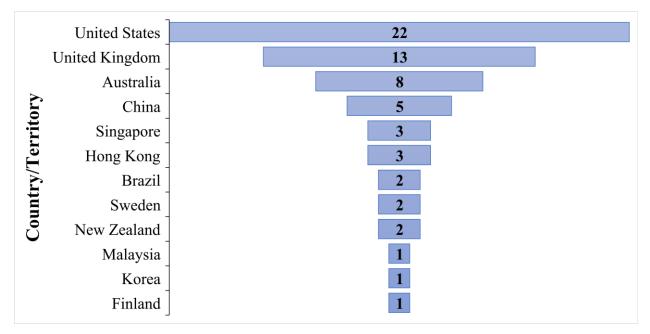
this time, researchers focused more on the drivers, benefits, and barriers to the adoption of the approach (Gibb and Isack 2001; Blismas et al. 2006; Polat 2008) in an attempt to promote the technique. The last decade (2009-2019) witnessed increased research attention on the determinant factors in deciding to use MiC in a project.

Journal/Conference	No. of Documents (n=57)
Journal of Construction Engineering and Management	7
International Journal of Construction Management	4
Journal of Management in Engineering	4
Architectural Engineering and Design Management	3
Construction Management and Economics	3
Automation in Construction	2
Building Research and Information	2
Journal of Architectural Engineering	2
Building and Environment	1
Chemical Engineering	1
Construction Innovation	1
Hydrocarbon Processing	1
International Journal of Construction Education and Research	1
Journal of Civil Engineering and Management	1
Journal of Cleaner Production	1
Journal of Computing in Civil Engineering	1
Journal of Engineering and Technology Management	1
Journal of Engineering, Project, and Production Management	1
KSCE Journal of Civil Engineering	1
Pharmaceutical Technology	1
Annual Conference of Associated Schools of Construction	2
CIB International Conference on Construction	1
Annual Conference of the International Group for Lean Construction	1
Annual ARCOM Conference	1
State-of-the-Art of Modular Construction Symposium	1
Books, Industry Reports and Theses	12

5 **Table 2**. Distribution of the included studies based on publication outlets

6 Although a sinusoidal annual pattern is observed during the period 2003 to 2019, Figure 5 7 shows that the last decade witnessed increased commitment from stakeholders and researchers in 8 understanding the factors and conditions favouring the adoption of MiC. This trend renders the 9 current study relevant because it is timely and will contribute to the effective understanding of 10 the DMFs in deciding to implement MiC in a project. Given the dynamic construction environment and the introduction of new technologies, the DMFs in the adoption of MiC may
have increased and changed within the year range (Haas and Fagerlund 2002). As such, the
identified DMFs offer holistic framework of the determinant factors which are useful in
evaluating the suitability of MiC and the final decision to implement the approach on a project.

5 The included studies were also published in high-impact CEM journals and conference 6 proceedings (See Table 2). The reviewed documents are published in 19 journals, 4 high-rated 7 construction management conference proceedings, and some industry websites. Furthermore, 8 preponderances of the articles were published in reputable CEM research outlets such as Journal 9 of Construction Engineering and Management (7), Journal of Management in Engineering (4), 10 International Journal of Construction Management (4), Architectural Engineering and Design 11 Management (3), Construction Management and Economics (3), Automation in Construction (2), 12 Building Research and Information (2), and Journal of Architectural Engineering (2). Published 13 articles from these influential journals collectively represented 27 (47.4%) of the included 14 studies. Thus, high-quality articles were included in the literature analysis. The rest of the 15 journals contributed 1 article each and contributed 12 (21.1%) of the included studies. Figure 6 16 shows the territorial distribution of the included studies.



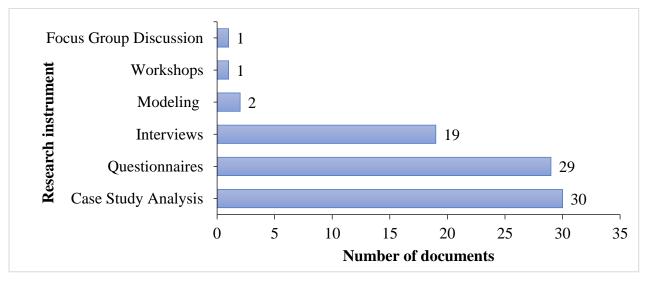
18 **Figure 6**. Geospatial distribution of the included studies

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1 Figure 6 indicates that the reviewed studies were conducted in the context of 12 countries 2 distributed across Europe (e.g. the United Kingdom), North America (e.g. the United States), 3 South America (e.g. Brazil), Asia (e.g. China) and Australia. The top 5 most contributing 4 countries included the United States (38.6%), United Kingdom (22.8%), Australia (14.0%), 5 China (8.8%), Singapore (5.3%) and Hong Kong (5.3%). These countries constitute a major 6 proportion of the regions with advanced levels of MiC adoption and implementation. On 7 continental basis, the adumbrated five continents are at the tipping point of the MiC 8 implementation and thus, the sample size may be representative of the global perspective. The 9 absence of studies from Africa is quite justifiable because countries in the continent are still 10 considering the adoption of MiC and the few available studies are focused on barriers, drivers, 11 opportunities, and benefits of its adoption.

12

Finally, the included studies deployed six research instruments to collect data on the determinant factors in deciding to use MiC in a project (See Figure 7). It should be reiterated that some studies used mixed approaches involving a combination of two or three of the instruments, but the authors counted the number of times each instrument was used. Consequently, the total percentage of all the instruments exceeds 100%. As shown in Figure 7, the three most used instruments included case studies (52.6%), questionnaires (50.9%), and interviews (33.3%).



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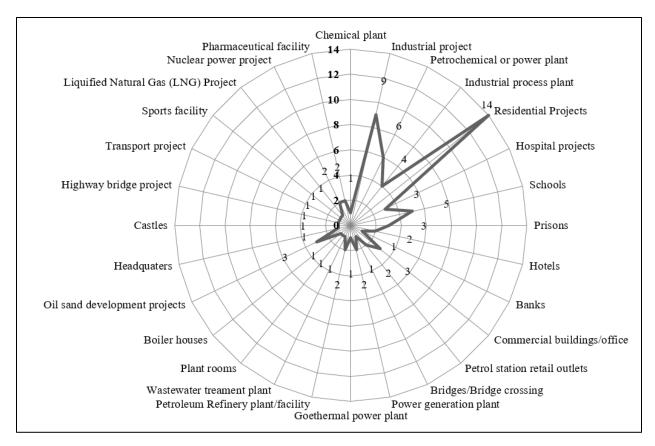
20 Figure 7. Frequency distribution of the research instruments used in previous studies

Although questionnaires and interviews have been widely censured for their subjectivity and data quality issues, their prominence in the previous studies is justifiable because the decision to adopt MiC in a project cannot be modelled or simulated without collecting the information from

1 project participants, industry players, experts, and stakeholders. Thus, using these instruments to 2 collect data on DMFs is appropriate. Moreover, the dominance of case study analysis as a data 3 collection instrument in previous studies is impressive because the DMFs are sensitive to project 4 type, size, location, and other characteristics. Thus, case studies offer a framework for a more detailed assessment of the DMFs within a specific project and has been widely used to collect in-5 6 depth information on a project in CEM studies (Wuni et al. 2019a; Wuni and Shen 2019). As 7 such, the research instruments used in previous studies to collect data on the DMFs for MiC 8 implementation decision-making are relevant and appropriate. Therefore, relevant and high-9 quality studies have been investigated in the current research.

10 Target project types for MiC implementation decision-making in previous studies

It is useful to highlight the project types for which the DMFs were extracted. This provides useful insight into the types of projects that have been involved in successful MiC implementation in previous studies. The authors extracted the project types which were used as case studies in identifying the key DMFs in MiC implementation. Figure 8 shows a distribution of twenty-eight project types which were used as case studies in previous studies and highlights that majority of project applications of MiC focused on residential projects (14), industrial projects (9), petrochemical or power plant (6), schools (5) and industrial process plants (4).



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2 Figure 8. Distribution of the target MiC projects in previous studies

3 The higher frequency of deciding to use MiC in residential projects may be due to the rising 4 global transition towards using MiC to address housing shortfalls and crises (Pan et al. 2007; Pan 5 et al. 2012). Moreover, the need to use modular solutions in industrial projects dominated the agenda in the MiC renaissance in North America during the last decade of the 20th century 6 7 (Clement 1989; Construction Industry Institute 1992; Murtaza et al. 1993; Murtaza and Fisher 8 1994) and may have accounted for the higher frequency of industrial projects involved in the 9 MiC implementation decision-making. Furthermore, the use of MiC to develop school buildings 10 have greater prominence in the literature because of the ability to construct buildings with less 11 disruptions to academic activities (Peltokorpi et al. 2018). From Figure 8, several project types 12 have been involved in the MiC implementation decision-making in previous studies and thus, the 13 framework of the DMFs in this study represent the primary determinant factors in the decision to 14 use MiC in these disparate project types. Therefore, the set of DMFs reported in the current study 15 may serve as a useful reference in deciding to implement MiC solutions to any of the above 16 project types.

1 Analysis and ranking of the DMFs in the adoption of MiC

2 The determinant factors in the decision to use MiC in a project were extracted from 57 research 3 studies. A bibliographic summary of these studies and their corresponding reference numbers are 4 presented in Table 1. Analysis of these studies resulted in the extraction of 51 DMFs for 28 5 project types (see Figure 8). A summary of these DMFs, their citing sources, frequency, and rankings are presented in Table 3. The various studies which cited each DMF are identified as 6 7 the citing sources; the references and corresponding bibliographic information of which can be 8 found in Table 1. The freq. in Table 3 is a measure of the cumulative number of studies which 9 have cited a DMF and have been used to rank the identified DMFs. This indicator-based ranking 10 approach has been implemented in published review studies (Wuni et al. 2019a).

11 Table 3 shows that several determinant factors need to be considered in deciding to use MiC 12 in a project, but analysis reveals that the ten most reported DMFs which are shared among MiC 13 projects and territories during the studied period were: (i) availability and accessibility of skilled 14 and experienced factory labour force; (ii) availability of skilled management and supervising 15 team; (iii) demanding and tight project schedule; (iv) transport infrastructure, size restrictions, 16 and equipment availability; (v) need for improved construction safety; (vi) strict requirement for 17 project quality control; (vii) stringent project cost and strict requirement for certainty; (viii) 18 availability of skilled onsite labour; (ix) reduced environmental impact and sustainability 19 requirements; and (x) overall cost control requirement. Due to space constraints, the first five of 20 these DMFs are discussed below. It should be immediately indicated that the remaining DMFs 21 are also relevant and critical depending on the project type, site, and territory. Indeed, there are 22 some conditions in Table 3 which are not within the first ten DMFs, but for which the decision to 23 use MiC may be highly recommended. For instance, MiC may be the best choice for projects in 24 remote and difficult locations under harsh weather conditions and climates (Clement 1989; 25 Construction Industry Institute 1992; Murtaza et al. 1993; Haas and Fagerlund 2002; Song et al. 26 2005). Moreover, MiC is highly recommended for projects with repetitive design layout (Hwang 27 et al. 2018); when there is the need to reduce neighbourhood and business disruption during 28 construction (Murtaza et al. 1993; Gibb 1999; Pan et al. 2007; Hwang et al. 2018) and when 29 clients and developers propose projects with very tight schedules (Construction Industry Institute 30 1992; Haas and Fagerlund 2002; Rentschler et al. 2016).

1 Availability and accessibility of skilled and experienced factory labour force

2 This factor was reported in 31 of the 57 studies as a primary determinant factor in the decision to 3 implement MiC and ranked 1st among the 51 DMFs. While this factor might not be a critical 4 consideration in territories with developed MiC supply chain with well-established modules 5 manufacturers and suppliers, it is a primary factor to consider because the factory-produced 6 modules are essentially the key driver of the MiC project (Construction Industry Institute 1992; 7 Haas and Fagerlund 2002). The production of the modules in factory environment allows for 8 quality control and improved productivity but these are linked to the skills and attitude of the 9 factory labour force (Egan 1998; Fraser et al. 2015). The factory labour force is required to have 10 effective skills in production engineering, process efficiency, work area control and mechanical 11 equipment handling (Fraser et al. 2015). Management needs to also consider whether the labour 12 force has the ability to assemble the factory-made components, handle large building services, 13 use the production raw materials and systems (Fraser et al. 2015). These should be given due 14 consideration because the skills and experience of the factory labour force has implications on 15 the quality of the modules which further have implications on the quality and performance of the 16 overall MiC project.

S.N.	Decision-making factor (DMF)	Citing sources (Ref#)	Freq	Rank
1	Availability and accessibility of skilled and experienced factory labour force	[1–31]	31	1
2	Availability of skilled management and supervising team	[1-5,7,8,11-14,17,19-34]	28	2
3	Demanding and tight project schedule and need for expedition	[1,2,5,7,9,10,13–18,21,22,27,30,33– 42]	26	3
4	Transport infrastructure, size restrictions, and equipment availability	[1,2,7–9,11,14–18,21,24,26,29,32– 35,43,44]	21	4
5	Need for improved construction safety	[1,2,25,26,28,31,32,34,37,39,44,45,5,4 6,7,12,15,18,20,23,24]	21	4
6	Strict requirement for project quality control	[1,2,5,7,12,13,15,18,20– 22,28,31,33,35,38,39,41,42,45]	20	6
7	Stringent project cost and strict requirement for certainty	[2,3,7,13,15,18– 21,24,26,28,30,31,34,35,41,42,47]	19	7
8	Availability of skilled onsite labour	[1–5,7,9,10,13– 15,18,24,26,28,29,31,34]	18	8
9	Reduced environmental impact and sustainability requirements	[2,4,5,7,9,15,18,20,21,23,24,26,31,32,3 4,39,41,45]	18	8
10	Overall cost control requirement	[2,3,7,13,15,18– 21,24,26,28,30,31,34,35,41,47]	18	8
11	Certainty of project completion date	[2,5,7,13,15,18,20,24,26,30,31,35,37,3 9,40,45,46]	17	11

17 **Table 3.** Determinant factors in the decision to implement MiC in a project

12	Labour cost at site location	[1,3– 5,13,15,18,19,24,26,28,29,31,33,46,47]	16	12
13	Availability of key MiC project team	[7,9,10,14–19,21,33,34,37,42,48,49]	16	12
-	members in the earliest stages of the project			
14	Remote and difficult site location	[2,7,16,20,24,26,29–32,38,40,41,46]	14	14
15	Need to reduce neighbourhood and	[2,4,5,7,15,17,18,24,26,31,32,37,40,46	14	14
	business disruption and noise during construction]		
16	Labour and plant cost on site	[2,3,7,13,19,20,27,28,30,31,35,47]	12	16
17	High standard quality of both internal and external finishes	[2,5,13,24,26,28,31,35,38,39,45,46]	12	16
18	Project and contract type	[14,16,17,21,33,34,37,39,41,43,48,50]	12	16
19	Site accessibility	[6,9,10,15–18,24,26,27,35]	11	19
20	Owner's understanding, receptivity and acceptance of MiC	[2,7,9,10,14–16,18,21,51,52]	11	19
21	Site condition, constraints and attributes	[9–11,15,17,18,21,33,34,38,48]	11	19
22	Organizational readiness and familiarity with MiC	[1-4,7,9,10,14,21,32,53]	11	19
23	Overall project timescale	[2,5,7,13,20,27,28,30,31,35]	10	23
24	Need to minimize field construction cost	[9,11,12,20,22,33,34,39,41]	9	24
25	Presence of repetitive layout design and construction	[9,10,23,27,29,32,33,41,54]	9	24
26	Availability of manufacturing facility within economical transport distance	[2,3,7,8,20,24,26,30,31]	9	24
27	Early upfront support and involvement of top management	[1-4,7,9,10,16,52]	9	24
28	Severe local area condition, harsh weather and climate	[1,2,6,7,23,33,34,38,41]	9	24
29	Suitability of design for MiC	[9,10,15,16,18,27,29,32]	8	29
30	Construction equipment quality and availability	[1,2,7,24,26,29,32,35]	8	29
31	Availability and capacity of modules fabricator and suppliers	[2,7,11,15,17,18,33,34]	8	29
32	Reducing traffic movement	[2,4,5,7,20,24,26,31]	8	29
33	Availability and use of relevant	[10,21,28,32,49,51,55,56]	8	29
	information and communication technology (e.g. BIM)			
34	Need to minimize field construction time	[14,23,32,38,40,41,46]	7	34
35	Need for inspection and supervision of modules	[2,7,10,17,23,30,32]	7	34
36	Structural stability of individual and assembled modules	[2,7,9,10,16,30,32]	7	34
37	Favourable local codes, building standards and zoning regulations	[9–11,15,18,21,39]	7	34
38	Business needs, owner requirement, and regulatory demand	[9,14,16,25,33,40,53]	7	34
39	Types and sizes of modules	[1,2,7,30,32,41]	6	39
40	Detailed and defined project scope, and budget parameters	[9,16,33,40,41,43]	6	39 39
41	Available of adequate lead time for modules manufacture	[2,7,10,30,32]	5	41
	modulos manufacture			

43	Available of local modular design codes and specifications	[9,10,15,21,39]	5	41
44	Capability of local MiC supply chain	[11,16,17,57]	4	44
45	Complexity of project design	[9,10,12,23]	4	44
46	Project risk profile	[9,10,15,41]	4	44
47	Site layout (e.g. availability of space to	[2,7,32]	3	47
	unload and store modules			
48	Detailed design	[15,18,52]	3	47
49	Building height (number of stories)	[32,54]	2	49
50	Module import restriction	[2,7]	2	49
51	Communication and collaborative	[14,48]	2	49
	culture			

1 Availability of skilled management and supervising team

2 This factor was cited in 28 of the 57 studies as a critical determinant factor in deciding to use 3 MiC and ranked 2nd among the 51 DMFs. This DMF is shared among all project types and territories because the management and supervision requirement of MiC projects demand more 4 5 bespoke skills than those of the traditional construction method. The success of the MiC project 6 largely depends on the effective management and supervision of the entire MiC process. It 7 requires extensive coordination of the various activities, processes, and the complex web of 8 stakeholders associated with the MiC supply chain (Haas and Fagerlund 2002; Hwang et al. 9 2018). Thus, the management and supervising team (MST) must be multiskilled to be able to 10 deliver the best from the MiC project (Construction Industry Institute 1992; Egan 1998; Gibb 11 1999). Typically, the MST must have knowledge of the entire MiC process and skills in 12 logistical and materials handling, supply chain coordination and management, project 13 integration, DfMA, MiC preconstruction planning and preparation, production lead times, and 14 possess greater technical skills in large building services installations and handling (Fraser et al. 15 2015). These capabilities are necessary because the MST would have to manage and supervise 16 these activities and processes throughout the MiC process (Fraser et al. 2015; Rentschler et al. 17 2016). This DMF must be carefully considered in the decision-making process because the 18 success of MiC entire depends on detailed design, effective planning, and a knowledge of the 19 MiC supply chain capabilities which are intertwined and linked with management.

20 Demanding and tight project schedule and need for expediting schedules

21 This factor has been cited in 26 studies and ranked 3rd among the 51 identified DMFs in previous

22 studies. The chief benefit of MiC is reduced construction time (Blismas et al. 2006; Pan et al.

23 2007). Therefore, projects that come with tight and demanding schedules justifies the need for

MiC. Experience has shown that MiC could result in a 50 – 70% reduction in the traditional construction schedules (Construction Industry Institute 1992). The concurrent continuity of onsite and off-site activities results in reduced construction time. Additionally, the factory-based quality control of the modules through mock-up testing/prototyping, trial assembly and stacking of modules results in lower defects during installation which reduces site-fit reworks and saves time (Construction Industry Council 2018). Thus, MiC is a superior choice for project with tight schedules.

8 Transport infrastructure, size restrictions, and equipment availability

This factor was cited in 21 studies and ranked 4th among the identified DMFs. In most cases, the 9 manufacturing plant or suppliers of the modules are sited in remote locations and thus, the 10 11 modules must be transported to the job site for assembly and final installation (Azhar et al. 12 2012). Therefore, in deciding to implement MiC, management must consider the availability of 13 suitable transport channels, local regulatory restrictions on transportable modules sizes, 14 availability of trucks, and the availability and capacity of on-site cranes (Carriker and Langar 15 2014). Moreover, the traffic situation in the neighbourhood must be given due consideration 16 since it can trigger delays in modular delivery to job site significantly and significantly affect the 17 tighter schedules of MiC resulting in expensive rates of hired equipment. In cases of where 18 importation and cross-border transportation of the modules are required, this DMF must be given 19 detailed analysis because it could result in excessive additional cost trigger (Pan and Hon 2018). 20 The availability of transport infrastructure in good condition, favourable regulatory restrictions 21 on modular sizes and equipment availability are suitable factors which favours the 22 implementation of MiC.

23 Need for improved construction safety

Construction is one of the most dangerous activities and occupation is the world (McGraw Hill Construction 2013). As such, there has been an increasing requirement for occupational safety improvement in the sector and concomitant commitment in the industry towards improving the safety and health of construction workers. MiC is championed as one innovative approach which improves construction safety (McGraw Hill Construction 2013). Owing to the reduced requirement to work from heights, controlled factory environment, and fewer workers on site, contractors have reported improved safety in MiC projects (McGraw Hill Construction 2013). Thus, it was not surprising that this factor was cited in 21 studies and ranked 4th among the identified DMFs. Considering that the traditional construction approach is found to be dangerous, MiC or a combination of both may be a superior choice in projects with strict requirement for improved construction safety performance. With the increasing requirements to improve safety in the sector, a critical consideration must be given to the safety benefits of MiC in deciding to implement the approach.

7 Conceptual framework of the DMFs in the Adoption of MiC

8 The foregoing discussion and the findings in Table 3 indicate that several factors must be 9 considered before deciding to use MiC in a project. Thus, conceptual design and planning stage 10 of MiC implementation involves a multicriteria decision-making problem. Given that not all 11 these factors are relevant to every project, it is useful to cluster the DMFs to facilitate informed 12 decision-making. This study conceptualizes the MiC DMFs as a multicriteria decision-making 13 problem involving labour consideration, project characteristics, location and site conditions, and 14 organizational factors. Figure 9 is a conceptual framework of the DMFs in deciding to use MiC 15 in a project.

16

17	Location and site attributes		Project characteristics
	• DMF#4: Transport infrastructure, size		• DMF#3: Demanding and tight project schedule
18	restrictions, and equipment availability		• DMF#5: Need for improved construction safety
	• DMF#13: Remote and difficult site location		• DMF#6: Strict requirement for project quality control
19	• DMF#19: Site accessibility		 DMF#8: Stringent project cost and strict requirement for certainty
•	• DMF#21: Site condition, constraints and		• DMF#9: Reduced environmental impact and
20	attributes		sustainability requirements
			• DMF#10: Overall cost control requirement
21	• DMF#26: Availability of manufacturing facility		• DMF#11: Certainty of project completion date
	within economical transport distance		• DMF#17: High standard quality of both internal and external finishes
22	• DMF#28: Severe local area condition, harsh		DMF#18: Project and contract type
	weather and climate		• DMF#23: Overall project timescale
• •			• DMF#24: Need to minimize field construction cost
23	• DMF#32: Reducing traffic movement		• DMF#25: Presence of repetitive design layout and
	• DMF#37: Favourable local codes, building		construction
24	standards and zoning regulations		• DMF#29: Suitability of design for MiC
			• DMF#30: Construction equipment quality and
25	• DMF#42: Availability of local modular design		availabilityDMF#33: Need to minimize field construction
23	codes and specifications		• DMF#35: Need to minimize held construction time
0.6	• DMF#44: Capability of local MiC supply chain		• DMF#35: Structural stability of individual and
26			assembled modules
	• DMF#47: Site layout (e.g. availability of space		• DMF#38: Types and sizes of modules
	to unload and store modules		• DMF#39: Detailed and defined project scope, and
	• DMF#50: Module import restriction	_24	budget parameters
	• • • • • • • • •		 DMF#41: Size and type of project DMF#45: Complexity of project design
			Divit ^m +5. Complexity of project design

DMFs for MiC

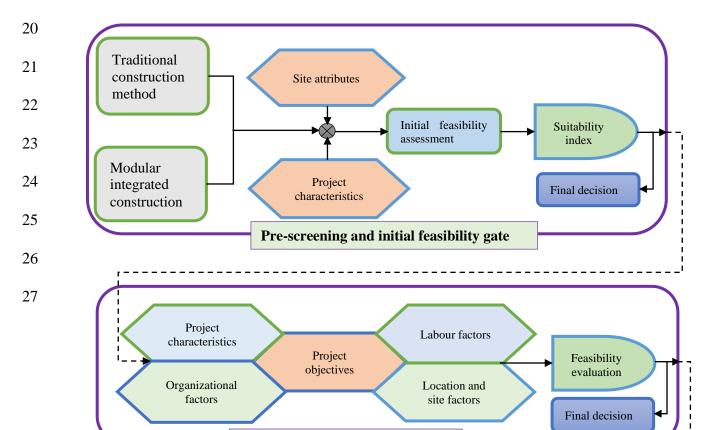
Figure 9. Conceptual framework of the DMFs for MiC implementation

Although overlaps exist, a detailed analysis of the 51 DMFs in Table 3 shows that the determinant factors are made of conditions, characteristics, and factors associated with labour, location and site, nature, and requirement of projects and organizational issues and requirements. This is consistent with the classification of Murtaza et al. (1993) and Haas and Fagerlund (2002). The conceptualized framework indicates that a combination of DMFs from each category must be analysed in deciding to use MiC in a project. Of the 51 DMFs, 22 are related to project characteristics and objectives; 12 are associated with location characteristics and site attributes; 8 are closely aligned with organizational planning and needs; and 8 are related to labour availability, capabilities, and requirements. The framework offers a more organized perspective of the nature of the DMFs and may facilitate more structured decision-making. Management may then determine the satisfactory combinations of the DMFs from each category which warrants the adoption of MiC in a project. Nevertheless, a decision to implement MiC in a project could result from the analysis of the DMFs in just one category, depending on the distinct objective of the proposed project.

1 Stage-gate model of the decision-making process in MiC implementation

2 A stage-gate model is developed in Figure 10 to pictorially demonstrate the decision-making 3 process in attempting to deploy MiC in a project. A stage-gate model divides a complex 4 decision-making process into distinct and sequential stages and gates (Jagoda and Samaranayake 5 2017). Each gate denotes a distinct decision-making framework where a decision-maker could 6 arrive at a conclusion and initiates a project or transition into another gate for further decision-7 making. Drawing on previous studies (Construction Industry Institute 1992; Murtaza et al. 1993; 8 Hwang et al. 2018), the proposed stage-gate model delineates the MiC implementation decision-9 making process into three levels or gates comprising pre-screening, detailed feasibility analysis 10 and economic analysis.

11 The schematic view of the stage-gate model is shown in Figure 10. The delineation of the 12 decision process into stages is relevant and necessary because not all projects require all three 13 stages in deciding to implement MiC. The information required at each stage also differs and 14 offers a more structured perspective of the decision-making process. For instance, clients and 15 developers may just be interested in determining a suitable method for a project based on their 16 objectives. The pre-screening gate alone could be used to provide this information. In this gate, 17 clients would have to evaluate the characteristics of the proposed project and the conditions and 18 attributes of the proposed site against the primary objectives. This will offer a preliminary 19 answer to whether MiC is the best choice (Murtaza et al. 1993).



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9 Figure 10. A stage-gate model for MiC implementation decision-making

10 As such, the stage-gate model conceptualizes that not all the identified DMFs (or the clusters) may be required to decide to implement MiC. Depending on the need of the client, one gate or 11 12 level may be adequate to support decision-making. If a client or management finds MiC as 13 suitable for the project, a more detailed analysis may be required to ascertain the design and 14 construction approach which offers the highest advantage and benefits for the proposed project 15 (Murtaza et al. 1993; Haas and Fagerlund 2002). Within the detailed feasibility gate, 16 management would be able to also analyse the benefits and advantages of adopting MiC or a 17 hybrid of the traditional method and MiC on a project. This stage requires more information on 18 each category of the DMFs and may be more complex than the pre-screening gate. Additionally, 19 the parameters of the second gate may become a starting point where a client or business dictates 20 the adoption of MiC. Thus, the first stage loses relevance as the suitability of MiC for the project 21 is answered within the demands of the client or the business needs.

Finally, the economic analysis gate offers the framework for management, clients or developers to ascertain the cost reduction, time savings, quality improvement, risk minimization, and sustainability performance associated with implementing MiC on the proposed project (Construction Industry Institute 1992; Murtaza et al. 1993). This would require information such as cost estimations, cash-flow patterns, safety performance simulation, among others. Essentially, the proposed stage-gate model offers a more structured and pictorial explanation of the decision-making process in MiC implementation. However, KBDSS which integrate expert systems and decision support systems (Hwang et al. 2018) is required to automate the decisionmaking process, but the identified DMFs in the study constitute the key input into the KBDSS.

4 Conclusions, limitations and future research direction

5 MiC is an innovative construction method which transforms the linear fragmented site-based construction of buildings into integrated production and assembly of value-added factory-made 6 7 prefabricated prefinished volumetric modules. The modus operandi of MiC offers adopters the 8 opportunity for improved quality control, the certainty of project cost and time, improved 9 environmental performance, reduced business disruption, and a safer working environment. 10 However, not every circumstance and condition warrant the implementation of MiC in a project. 11 As a result, this research investigated the determinant factors in deciding to implement MiC in a 12 project through the lens of systematic review methodology. The research recruited and analysed 13 57 studies on the DMFs published during the year 1989-2019, which covered the most significant period in the MiC renaissance in the 20th and 21st centuries. 14

15 Annual publications trend analysis showed that the MiC DMFs only gained significant and 16 increasing attention during the last 1.5 decades. A geospatial analysis showed that the 57 studies 17 have been conducted in the context of 12 countries distributed across Europe, North America, 18 South America, Asia Pacific, and Australia. These continents have the most advanced levels of 19 MiC implementation where the technology is currently at its tipping point and thus, provided a 20 useful basis to establish a framework of the DMFs drawing on 28 successful MiC project types. 21 Further analysis revealed that previous studies predominantly used case study analysis, 22 questionnaires, and interviews as the data collection instruments. Analysis of the included studies 23 resulted in the extraction of 51 DMFs for the 28 different MiC project types. Of these, the top 10 24 most cited DMFs were: (i) availability of skilled and experienced factory labour force; (ii) 25 readily available skilled management and supervising team; (iii) demanding and tight project 26 schedule; (iv) transport infrastructure, size restrictions, and equipment availability; (v) need for 27 improved construction safety; (vi) strict requirement for project quality control; (vii) availability 28 of skilled onsite labour; (viii) stringent project cost and strict requirement for certainty; (ix) 29 reduced environmental impact and sustainability requirements; and (x) overall cost control 30 requirement. These are shared among project types and territories, highlighting their significance

in the decision to implement MiC. The research further conceptualized the 51 DMFs into a
framework comprising labour factors, project characteristics, location and site conditions, and
organizational factors. A stage-gate model is proposed to demonstrate the MiC implementation
decision-making process.

5 Therefore, the robust analysis presented in this paper has both theoretical and practical 6 significance. Theoretically, the paper contributes to a better theoretical and conceptual 7 understanding of the determinant factors in deciding to implement MiC in a project. Practically, 8 the findings of this research make a useful contribution to knowledge of the MiC implementation decision-making process. This will help clients, developers, industry practitioners, and 9 10 government authorities to determine when it is feasible and appropriate to deploy MiC in a 11 project to maximize benefits and minimized risk. For researchers, the checklist and framework of 12 the identified DMFs would form a useful basis for developing decision support and expert 13 systems for MiC projects in different jurisdictions.

14 However, the following limitations of the study are noteworthy. First, the study conducted a 15 comprehensive literature search during the process, but some relevant studies may have been 16 missed. Second, the rankings of the DMFs were not based on relative importance but based on 17 frequency of citations. This may limit the relevance of the rankings. Future studies will address 18 these limitations and improve the decision-making process through the following: (i) critically 19 examine the decision-making process currently used in the industry; (ii) determine the most 20 critical DMFs in the use of MiC in a project; (iii) develop a decision support system for MiC 21 implementation; and (iv) develop guidelines to help industry practitioners effectively deploy the 22 decision support system.

23 Acknowledgment

The work described in this paper is fully funded by the Department of Building and Real Estate of the Hong Kong Polytechnic University under the auspices of the Research Grants Council of the Hong Kong Special Administrative Region (PF17-00649). However, the views expressed herein are solely those of the authors and not the funding body.

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