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Managing critical drivers for building information modelling implementation in the Singapore construction industry: an organizational change perspective

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ABSTRACT

Building information modelling (BIM) implementation has been mandated in the Singapore construction industry, but it is still plagued with challenges such as lack of contractor input in design models. Thus, the industry still needs changes in the BIM implementation. This study aims to identify critical drivers for change (CDCs) towards full BIM implementation, demonstrate the theoretical rational behind the CDCs, and formulate strategies to strengthen the CDCs. Conducting a questionnaire survey with 86 professionals, this study identified 31 CDCs, among which 'BIM vision and leadership from the management' was ranked top. The results indicated that these CDCs could be interpreted with an adapted organizational change framework in which process-related attributes were key to changing towards full BIM implementation. The identification of the CDCs and the strategies enables the project management team to obtain sufficient support for strengthening the positive influence from the CDCs and enhancing BIM implementation. Additionally, overseas construction practitioners can use the drivers and strategies identified in this study to prepare their customized lists of drivers and strategies.

KEYWORDS

Building projects; building information modelling; organizational change; driver; Singapore

Introduction

In recent years, the value of implementing building information modelling (BIM) has been increasingly recognized among private and government owners globally. It is not uncommon today that governments encourage, specify, or mandate the use of BIM in publicly funded construction and building projects (Smith 2014). Such commitment on the BIM implementation enables the enlightened owners to empower design and construction firms to leverage BIM technologies to meet or even exceed their project goals. Cheng and Lu (2015) reported that as one of the leading countries in implementing BIM in Asia or even worldwide, Singapore has made substantial efforts to drive the industry-wide BIM implementation, such as mandating architectural and engineering e-submissions in BIM format for all new building projects with a gross floor area over 5,000 m² since July 2015. In addition, Singapore's Building and Construction Authority (BCA) has been driving the whole construction value chain to work collaboratively and optimize building designs for off-site manufacture (OSM) which are encouraged in full BIM implementation (BCA 2016).

In general, full BIM implementation requires that the relationships between the key participants in a project are bound with multi-party collaboration contracts and these

participants are involved in the project very early, even before the design starts (El Asmar et al. 2013; Porwal and Hewage 2013). Despite the substantial efforts made, changing towards full BIM implementation is generally slow in most projects in the global construction industry due to the entrenchment in the traditional object-oriented computer-aided design (CAD) or wait-and-see attitude (Porwal and Hewage 2013; Juan et al. 2017). Therefore, BIM implementation in building projects needs to be enhanced. It is suggested that the best way to drive the projects to change towards full BIM implementation is to get the participants to understand the potential and the value of BIM over the traditional project delivery (Khosrowshahi and Arayici 2012). However, a holistic view of the critical drivers for change (CDCs) towards full BIM implementation in the construction industry has not been well established. In addition, full BIM implementation in the building project team can be conceptualized as a gradual organizational change (Azhar et al. 2014). This is because: the participating firms of the project can be seen as the business units of an organization which work for the same goals (Verdecho et al. 2012), and most firms tend to be accustomed to the traditional project delivery using the traditional CAD or using BIM lonely and thus should adapt to a new delivery process with the help of new technologies.

The objectives of this study are to identify the CDCs towards full BIM implementation in building projects in Singapore, demonstrate the theoretical rational of the CDCs, and formulate possible strategies to strengthen the positive influence from these CDCs. In order to interpret full BIM implementation in building projects, this study adapted existing organizational change theories into a new organizational change framework with 29 organizational change attributes which fell into four groups, namely people, process, technology, and external environment aspects. The results of this study could be useful to project management teams which are facing difficulties in obtaining sufficient support from the owners and service providers for implementing the required changes towards full BIM implementation from the early design stage to the facility management stage. In addition, although this study focuses on the context of the Singapore construction industry, overseas construction practitioners can use the drivers and their corresponding strategies identified in this study to customize their own lists of drivers and strategies according to their project circumstances. Thus, it is believed that this study would contribute to the literature related to BIM implementation.

Literature review

Drivers for change towards full BIM implementation

Previous studies have reported that a number of factors could drive the change towards full BIM implementation in the global construction industry. In this study, two methods were used to identify the drivers for change towards full BIM implementation from the literature: (1) keyword search in peer-reviewed journals; and (2) expansion search through citation links. Two groups of keywords were used. The first group comprised of driver, success factor, and benefit; the second group included building information model and BIM. Articles that contain one keyword in the first group and one in the second group in the title/abstract/keywords were retrieved. In addition, extra articles were obtained through the citation links from the articles reviewed. Consequently, as shown in Table 1, a total of 32 factors driving for full BIM implementation were identified from the 26 previous studies related to BIM implementation in various countries. However, these studies usually examined only a few specific factors (see Table 1) that enhanced the BIM implementation in particular projects in various countries, and did not investigate these factors from an organizational change perspective in the project context. It would be difficult for firms to use BIM fully without considering all the

identified drivers from the people, process, technology, and external environment aspects holistically. For instance, without the participation of downstream people such as key contractors in the design stage or effective data exchange between the contractors and designers, the repeated efforts by the designers and the contractors are inevitably needed to create design models in their own ways, respectively. This phenomenon is not uncommon both in Singapore (Lam 2014) and overseas (Sattineni and Mead 2013). Gao and Fischer (2006) focused on driving the collaboration between the contractors and the designers to create composite design models that fit for the downstream uses, but the involvement of facility managers in this process was rarely studied. Eastman et al. (2011) investigated the majority of the identified factors but did not study the critical role of governments (external political environment) in terms of their active participation during design to specify BIM use as well as their financial support such as subsidising training and consultancy costs. McFarlane and Stehle (2014) focused on the incorporation of new design and construction method, namely OSM into BIM processes. Other previous studies investigated even fewer factors driving for change towards full BIM implementation (see Table 1). Furthermore, the specific factors identified in these previous studies were not linked to all the people, process, technology, and external environment aspects which play critical roles in the organization-wide changes towards full BIM implementation. Therefore, this study intends to fill this gap by identifying the drivers with significant influence on changing towards full BIM implementation in building projects in Singapore and demonstrating the theoretical rationale behind these drivers from the organizational change perspective, extending the relevant literature.

Organizational change

Organizational change is defined as ‘an empirical observation of difference in form, quality or long-term state of an organizational entity, coming out of the deliberate introduction of new styles of thinking, acting or operating, looking for the adaptation to the environment or for a performance improvement’ (Pardo-del-Val et al. 2012). Michel et al. (2013) advocated that organizations operating in a changing environment need sustainable organizational changes for their own survival and success. Among the number of organizational change theories, Leavitt’s diamond theory was selected in this study because it assess the organization’s current level of functioning and activities for designing better strategies of

Table 1. Drivers for change towards full BIM implementation.

Code	Drivers for change towards full BIM implementation	References																													
		1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	
D01	BIM vision and leadership from the management	✓															✓														✓
D02	Changes in organizational structure and culture		✓	✓	✓												✓														✓
D03	Stakeholders seeing the value of adopting their own part of BIM		✓	✓	✓												✓														✓
D04	Training on new skillsets and new ways of working		✓	✓	✓						✓						✓														✓
D05	Owner's requirement and leadership to adopt BIM		✓	✓	✓						✓						✓														✓
D06	Regulatory agencies' early participation to BIM use	✓																													✓
D07	Gaining competitive advantages from full BIM use	✓															✓														✓
D08	All disciplines sharing models in a 'Big Room'									✓						✓	✓														✓
D09	Government support such as subsidizing training, software, and consultancy costs															✓	✓														✓
D10	Enabling subcontractors to use lower-skilled labor on site																✓														✓
D11	OSM lowering safety risks by controlling work in factory								✓								✓														✓
D12	Alignment of the interests of all stakeholders																✓														✓
D13	Governance of BIM-related policies and standards																✓														✓
D14	Data sharing and access on BIM platforms																✓														✓
D15	Three-dimensional (3D) visualization enabling design communication		✓														✓														✓
D16	Four-dimensional simulation before construction										✓						✓														✓
D17	Design coordination between disciplines through clash detection and resolution		✓								✓						✓														✓
D18	Complex design analysis in sustainability, material selection, and constructability		✓								✓						✓														✓
D19	Project lifecycle costing										✓						✓														✓
D20	Producing models and drawings for construction and fabrication										✓						✓														✓
D21	High accuracy of model-based documentation										✓						✓														✓
D22	More off-site fabrication and assembly of standard elements										✓						✓														✓
D23	Automatic model updating and drawing production to deal with design changes and their implications										✓						✓														✓
D24	Lifecycle information management improving facility management	✓														✓	✓														✓
D25	Increasing use of design-build and fast-track approach										✓						✓														✓
D26	On-site work proceeds in parallel with off-site production										✓						✓														✓
D27	OSM standardizes design and manufacturing processes, simplifying construction and testing and commissioning processes										✓						✓														✓
D28	OSM produces building elements with better quality and consistency																✓														✓
D29	OSM reduces building wastes, especially on-site wastes																✓														✓
D30	Integrating model management tools with enterprise systems to exchange data																✓														✓
D31	Increasing complexity in buildings, project delivery, and marketplace																✓														✓
D32	New technologies such as Computer Numerically Controlled machines																✓														✓
Total number of drivers studied		6	4	5	7	4	3	3	8	5	5	12	1	5	11	4	11	1	5	10	4	10	2	6	11	5	3	2	11	4	

Notes: 1. American Institute of Architects, California Council (AIACC 2014); 2. Aranda-Mena et al. (2009); 3. Arayici et al. (2011); 4. Autodesk (2012); 5. Azhar et al. (2014); 6. BCA (2013); 7. Bernstein and Pittman (2004); 8. Blismas and Wakefield (2009); 9. Blismas et al. (2006); 10. Chua and Yeh (2015); 11. Eastman et al. (2011); 12. Fischer et al. (2014); 13. Fischer (2008); 14. Gao and Fischer (2006); 15. Gibb and Isack (2003); 16. Juan et al. (2017); 17. Kent and Becerik-Gerber (2010); 18. Khanzode et al. (2007); 19. Khosrowshahi and Arayici (2012); 20. Kiani et al. (2015); 21. Kunz and Fischer (2012); 22. Li et al. (2009); 23. Liao et al. (2017); 24. McFarlane and Stehle (2014); 25. Ross et al. (2006); 26. Sattineni and Mead (2013); 27. Selvaraj et al. (2009); 28. Won et al. (2013); 29. Zahrihan et al. (2013). ✓ Indicates the inclusion of the specific driver in the reference.

implementing new technologies (Dahlberg et al. 2016), which is consistent with the Singapore government's encouragement to using BIM in the local industry.

Leavitt's diamond theory was developed to analyse the organization-wide effects when changes take place (Leavitt 1965). This theory identifies four interrelated factors: task, people, structure, and technology in an organization (system). 'Task' refers to what the organization tries to achieve and how things are being done. 'People' refer to the employees including their roles and responsibilities as well as characteristics, such as skills and knowledge. 'Structure' refers to the relationships, communication patterns, and collaboration between 'people'. 'Technology' enables 'people' to perform the 'task', such as software applications. Any change occurring in any factor will affect the entire organization; the organization can be thought of as maintaining a balance of the four factors. Thus, the theory can help organizations apply new technologies to the workplace in a way that lessens stress and encourages teamwork (Smith et al. 1992).

The theory has been widely recognized and applied in previous studies (Wigand 2007; Ranjbari 2013; Dahlberg et al. 2016) in novel and critical ways. For instance, Rockart and Scott Morton (1984) expanded Leavitt's diamond theory by incorporating Chandler's (1962) finding that 'changes in strategy would drive changes in structure' (see Figure 1). The expanded theory particularized Leavitt's diamond model by: (1) changing its generic 'task' into the broader concept of the organization's strategy since 'strategy' represents a summing of the organization's tasks; (2) adding 'corporate culture' to expand organization structure; (3) adding a box for 'management processes', such as meetings and plans creation; and (4) adding two forces in the external environment. Thus, it is crucial to find the link between strategic ideas and the implementation of new technologies. In addition, the expanded theory forms the foundation for MIT90s framework (see Figure 2) which was designed to encourage organizations to understand the dynamics of transformation and the acquisition of new technology (Scott Morton 1991; Mistry 2008). The major difference

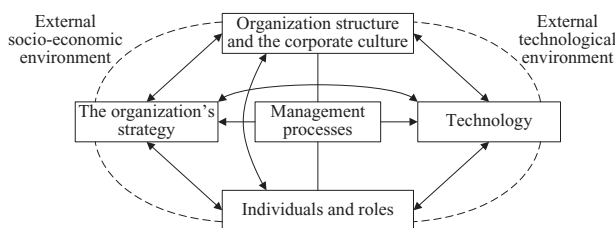


Figure 1. Expanded Leavitt's diamond model of technology impact (Rockart and Scott Morton 1984).

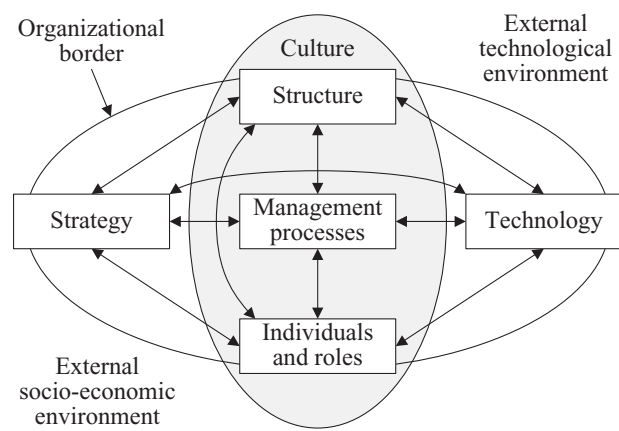


Figure 2. MIT90s framework (Scott Morton 1991).

between the expanded Leavitt's diamond theory in Figure 1 and the MIT90s framework is the scope of organizational culture. The MIT90s framework regards organizational culture as an integral part of the organization rather than a dimension of organizational structure.

Although the MIT90s framework focuses on individual enterprise contexts, its application in inter-organization context has been justified by conceptualizing the collaborative inter-enterprise context as an organization that pursues common objectives. For example, Verdecho et al. (2012) adapted the MIT90s framework to study the factors that influence inter-enterprise collaboration in the renewable energy sector. In the adapted framework, the enterprises need to manage and balance four groups of interrelated factors: strategy, organizational structure, culture, and business processes and infrastructure. The strategic factors are in an upper level because strategic aspects (such as the need of being competitive) drive the collaboration among enterprises.

Dahlberg et al. (2016) argued that the factors of Leavitt's diamond theory were generic and lack contemporary constructs, and modified the wording of some factors in the theory by: (1) replacing 'technology' with 'technology, IT services, and information'; (2) modifying 'structure' into 'strategy, business model, and governance'; and (3) replacing 'task' into 'tasks and processes' (see Figure 3). Such modifications were regarded as the updates of Leavitt's theory that reflect contemporary constructs, not as changes to the logic of the original

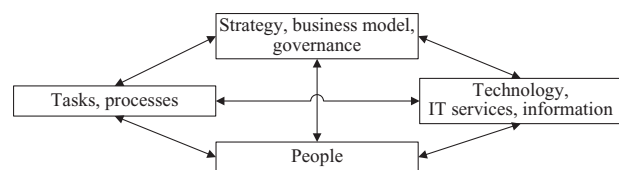


Figure 3. Modified Leavitt's diamond theory (Dahlberg et al. 2016).

theory. This modified theory was validated through interviews with 36 chief information officers (CIOs) within six industries and found that this theory could describe how technology and corporate strategy changes influence the CIOs' roles and tasks in a bidirectional way.

An adapted framework for organizational change

Leavitt's organization theory was also applied in construction management studies. For example, Kasimu et al. (2012) adapted the theory's four interrelated factors to outline the key variables in the development of a knowledge management implementation framework for construction firms. Although Leavitt's diamond theory and the MIT90s framework have been applied to study the effects of information technology changes within individual organizations, little is known about the changes to inter-organization contexts when implementing BIM rather than the traditional CAD. A building project team is a collaborative inter-enterprise context, which can be thought of as a large organization in which multiple business units (project participants) pursue common goals within project constraints (Verdecho et al. 2012). In addition, the establishments of intra- and inter-organizational technology deployment are similar (Croteau and Bergeron 2009; De Haes et al. 2012). Thus, full BIM implementation in the building project team context is justified as an organizational evolution (Azhar et al. 2014), because individual participants tend to be stuck to the use of the traditional CAD approach or the use of BIM alone.

Lyytinen and Newman (2008) stated that Leavitt's theory's four-factor classification is good because it is simple, extensive, and sufficiently well defined; it can be, if needed, easily extended with other categories to obtain richer vocabulary. For example, Kwon and Zmud (1987) augmented the theory with the concept of an environment; while other studies have included also culture (Davis et al. 1992).

This study constructs a people, process, technology, and external environment framework by adapting the main factors of Leavitt's theory and the MIT90s framework to study the factors that drive the industry players to change towards full BIM implementation (see Table 2). First, 'people' represent the project participants and their employees. This includes: (1) 'inter-enterprise structure' (Leavitt 1965; Rockart and Scott Morton 1984; Verdecho et al. 2012) associated with the 'business model' (Dahlberg et al. 2016) to emphasize the collaboration between the participants; (2) the 'corporate culture' (Rockart and Scott Morton 1984; Verdecho et al. 2012) to describe the cultural issues in individual

participants; and (3) the 'individuals and roles' (Rockart and Scott Morton 1984) to characterize the employees. Second, 'process' refers to various work processes with or without BIM use in the project lifecycle. This component consists of the 'management processes' (Rockart and Scott Morton 1984), the 'tasks' (Dahlberg et al. 2016), and the 'organization's strategy' (Rockart and Scott Morton 1984) because 'strategy' represents the summing of the organization's tasks. Thirdly, 'technology' is the BIM-related tools that are constantly improving. In addition, 'external environment' describes the external driving forces such as the policies that project participants must comply with. Table 2 also presents the attributes of each factor in the adapted framework. This modified classification echoes sentiments in previous studies (Teo and Heng 2007; Teo 2008) which focused on deploying automated quantity take-off system in terms of people, process, and technology in Singapore. Thus, this adapted framework expands the existing literature related to organizational change in the construction industry and can be appropriately used in the Singapore construction industry.

Method and data presentation

In order to investigate the influence of the drivers on changing towards full BIM implementation in the Singapore construction industry, a questionnaire survey was carried out. The preliminary questionnaire was designed based on the literature review. In a pilot study, interviews were conducted with five BIM experts who were invited to comment on the relevancy, accuracy, readability, and comprehensiveness of the 32 drivers. All the experts had more than three years' experience of implementing BIM in the local construction industry. Among which, three were project manager, corporate BIM manager, and technical manager, respectively, of large construction and development firms with over 10 years' experience in this field, and the other two had over five years' work experience including one quantity surveying in charge from a general construction firm and one senior architectural associate from a large architectural firm. These interviews helped refine the questionnaire. Thus, the drivers presented in Table 1 were validated by the experts. In the final questionnaire, the research objectives and contact details were presented, followed by the first section to profile the respondents and their organizations. Then, the respondents were asked to rate the influence of the 32 drivers on the BIM implementation in one of their building projects, using a five-point Likert scale (1 = very insignificant; 2 = insignificant; 3 = neutral; 4 = significant; and 5 = very significant). According to the 'seven plus or minus two' principle

Table 2. Adapted organizational change framework for full BIM implementation in building project context.

Components	Factors	Attributes	Code	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18
People	Inter-enterprise structure	Contractual relationship	PE01											✓					✓		
		Leadership	PE02	✓							✓								✓		
		Reward arrangement	PE03											✓		✓				✓	
		Involvement	PE04											✓		✓					
		Risk allocation	PE05				✓														
	Corporate culture	Conflict management	PE06		✓																
		Sharing	PE07				✓														
		Willingness to change	PE08											✓							
		Commitment on new ways	PE09											✓							
	Individuals and roles	Trust and transparency	PE10	✓																	
		Mindset and attitude	PE11																		
		Knowledge, skills and experience	PE12					✓													
		Training and education	PE13	✓																	
Process	Management processes	Communication	PR01																		
		Controlling and decision-making	PR02		✓									✓							
		Goals and requirements setting	PR03							✓											
	Corporate strategy	Vision and mission	PR04	✓																	
		Top management support	PR05																		
		Processes alignment	PR06																		
	Task	Coordination and simulation	PR07					✓													
		Documentation	PR08																		
		Production	PR09																		
		Model management	PR10																		
Technology	Infrastructure	Hardware and software solutions	T01					✓													
	Data exchange	Interoperability	T02																		
	Construction method	Prefabrication	T03											✓							
External environment	Socioeconomic environment	Policy	E01																		
		Changing market	E02					✓													
	Technological environment	New technological solutions	E03												✓						

Notes: 1. Alshaheer (2013); 2. Bikson and Eveland (1990); 3. Bobbitt and Behling (1981); 4. Croteau and Bergeron (2009); 5. Dahlberg et al. (2016); 6. Dahlberg (2016); 7. Higgins (2005); 8. Kasimu et al. (2012); 9. Lyytinen and Newman (2008); 10. Mitchell (2013); 11. Price and Chahal (2006); 12. Rockart and Scott Morton (1984); 13. Sarker (2000); 14. Smith et al. (1992); 15. Teo and Heng (2007); 16. Verdecho et al. (2012); 17. Wigand (2007); 18. Wiffling and Baumel (2011). ✓ Indicates the inclusion of the specific attribute in the corresponding reference.

Table 3. Profile of respondents and their organizations.

Characteristics	Categorization	N	%	Characteristics	Categorization	N	%
<i>Respondents</i>				<i>Organizations</i>			
Discipline	Government agent	2	2.3	Main business	Architectural firm	18	20.9
	Developer	5	5.8		Structural engineering firm	5	5.8
	Architect	21	24.4		MEP engineering firm	13	15.1
	Structural designer	8	9.3		General construction firm	30	34.9
	MEP designer	9	10.5		Trade construction firm	3	3.5
	General contractor	28	32.6		Facility management firm	3	3.5
	Subcontractor	6	7.0		Others	14	16.3
	Supplier/Manufacturer	2	2.3				
	Facility manager	5	5.8				
Work experience	5–10 years	39	45.3	Years of BIM adoption	0	9	10.5
	11–15 years	10	11.6		1–3	40	46.5
	16–20 years	8	9.3		4–5	22	25.6
	21–25 years	9	10.5		6–10	13	15.1
	>25 years	20	23.3		>10	2	2.3

(Miller 1956), the scale of five was adopted in this study, which is convenient for respondents to make their judgments.

The population consisted of all the organizations in the Singapore construction industry. The sampling frame included the BCA, the Urban Redevelopment Authority, the Housing and Development Board (HDB), the building developers registered with the Real Estate Developers' Association of Singapore, the architectural consultancy firms registered with the Singapore Institute of Architects, the structural and mechanical, electrical, and plumbing (MEP) consultancy firms registered with the Association of Consulting Engineers Singapore, the contractors registered with the BCA, and the facility management firms registered with the Association of Property and Facility Managers. Among the contractors, it was considered logical to select only the large ones because they tend to have adequate resources for full BIM implementation. Thus, a total of 692 organizations were approached for this survey. The questionnaires were sent to them through emails or handed to them personally. Finally, a total of 86 completed questionnaires were received. The response rate was 12.43%, which was acceptable because it fell within the general response rate of Singapore surveys range of 10%–15% (Teo et al. 2007).

Table 3 shows the profile of the respondents and their organizations. The top three disciplines of the respondents were: general contractor (32.6%), architect (24.4%), and MEP designer (10.5%). The 14 organizations in the 'others' category included the BCA, the HDB, developers, precasters, and other consultancy firms such as multidisciplinary consultancy firms and a BIM consultancy firm. Thus, the responding organizations can represent the key BIM users in the construction value chain in Singapore. Moreover, since the mandatory BIM implementation took effect in July 2015, under half (43.0%) of the responding organizations had implemented BIM more

than three years, implying that the local construction industry had been moving from the traditional project delivery into BIM-based project delivery and was shifting to full BIM implementation. Hence, the data collected are reliable.

As ordinal data, Likert scale ratings have been advocated to be analysed by parametric statistical methods in many studies, such as *t*-test (Binder 1984; Hwang et al. 2014; Zhao et al. 2016). Thus, the one-sample *t*-test was conducted in this study to check whether the respondents significantly agreed on the influence of the 32 drivers on changing towards full BIM implementation. The drivers that obtained mean scores above 3.00 and *p*-values below 0.05 were deemed critical (Zhao et al. 2014).

Results and discussion

CDCs towards full BIM implementation

The data of the respondents' perceptions on the influence of the drivers on changing towards full BIM implementation in building projects in Singapore received a Cronbach's α coefficient value of 0.968, implying high reliability of the data. Table 4 presents the one-sample *t*-test results. 31 out of the 32 drivers obtained mean scores above 3.00 and *p*-values below 0.05, indicating that the 31 factors were critical to changing towards full BIM implementation in building projects in Singapore. In addition, the overall mean scores of the drivers range from 2.90 to 3.99. These drivers were ranked according to their mean scores.

D01, 'BIM vision and leadership from the management', was ranked top (mean = 3.99). This result echoed Autodesk (2012) which found that the BIM implementation in a building project starts with a well-articulated vision that should be sponsored by the executives of the project team. Without the vision of implementing BIM and the executive leadership behind it, the effort to

Table 4. CDCs towards full BIM implementation in building projects in Singapore.

Code	Mean	Overall rank	p-value	Classification	Rank within classification	Code	Mean	Overall rank	p-value	Classification	Rank within classification
D04	3.81	4	0.000*	PE	1	D13	3.57	15	0.000*	PC	7
D06	3.76	6	0.000*	PE	2	D21	3.56	16	0.000*	PC	8
D03	3.71	9	0.000*	PE	3	D23	3.49	18	0.000*	PC	9
D02	3.66	11	0.000*	PE	4	D16	3.43	20	0.000*	PC	10
D08	3.62	12	0.000*	PE	5	D18	3.43	20	0.001*	PC	10
D14	3.60	13	0.000*	PE	6	D28	3.31	24	0.008*	PC	12
D12	3.45	19	0.000*	PE	7	D24	3.29	27	0.009*	PC	13
D25	3.35	23	0.005*	PE	8	D26	3.28	28	0.010*	PC	14
D11	3.31	24	0.007*	PE	9	D27	3.26	30	0.024*	PC	15
D10	2.90	32	0.404	PE	10	D19	3.23	31	0.034*	PC	16
D01	3.99	1	0.000*	PC	1	D30	3.59	14	0.000*	T	1
D17	3.92	2	0.000*	PC	2	D22	3.55	17	0.000*	T	2
D05	3.90	3	0.000*	PC	3	D29	3.27	29	0.030*	T	3
D07	3.78	5	0.000*	PC	4	D09	3.70	10	0.000*	E	1
D15	3.74	7	0.000*	PC	5	D31	3.40	22	0.001*	E	2
D20	3.74	7	0.000*	PC	5	D32	3.30	26	0.006*	E	3

Note: *The one-sample *t*-test result is significantly higher than the test value (3.00).

adopt new ways of working will struggle and waste the dedicated resources. D17, 'design coordination between disciplines through clash detection and resolution', received the second position (mean = 3.92) in the overall ranking, substantiating the value of fully coordinated 3D data. Similarly, this result was in line with previous studies (Porwal and Hewage 2013; Sattineni and Mead 2013) which found that full BIM implementation would enable the design team to create a composite and fully coordinated design model for documentation and collaboration in the project. D05, 'owner's requirement and leadership to adopt BIM', was ranked third (mean = 3.90), indicating that the requirement and active participation of the owner would motivate its service providers to implement BIM. This result was consistent with the findings of Arayici et al. (2011) and Azhar et al. (2014) that without the requirement and support from the owner, the service providers may continue to deliver their scopes of work in their accustomed ways, hindering the project-wide BIM implementation.

Interpretation of CDCs from the organizational change perspective

As mentioned above, it was justified that full BIM implementation in the project team context can be considered as an organizational change, this study interprets the CDCs towards full BIM implementation in building projects in Singapore from the perspective of organizational change. As shown in Figure 4, all the 29 attributes of the adapted organizational change framework can be applied to interpret some of the 31 CDCs.

People

The relationships between the participating firms are crucial to organizational change in the building project context. The CDC 'increasing use of design-build and

fast-track approach' (D25) is closely associated with 'contractual relationship' (PE01) in the attributes of the organizational change framework. As an organizational change, full BIM implementation requires close collaboration among the participants, such as the collaboration between the design team and construction team in design-build projects (Eastman et al. 2011; Azhar et al. 2014). The collaboration needs the participation of all the key participants (the owner, the architect, the engineers, key contractors, the supplier, and the facility manager), especially during the design stage, where they have to co-locate to develop and share digital design models. Thus, D08 can represent 'involvement' (PE04). Besides, since incorrect information providers may suffer from potential liability issues such as claims, the parties tend to be wary of providing information or advice to other parties. The pains and gains should be collectively shared in the team to remove the liability issues. Thus, the CDC 'alignment of the interests of all stakeholders' (D12) can be associated with 'reward arrangement' (PE03), 'risk allocation' (PE05), and 'conflict management' (PE06) in the organizational change attributes. In addition, in the context of mandatory submissions in BIM format in Singapore, regulatory agencies would provide high-level compliance information which leads the project team to design, build, and manage the building using BIM. Their involvement in the design process minimizes agency comments and required changes to the design as submitted for permit (AIACC 2014). Thus, the CDC 'regulatory agencies' early participation to BIM use' (D06) can represent 'leadership' (PE02).

Corporate culture also plays a critical role in organizational change. As mentioned above, the removal of the potential liability concerns would facilitate the direct and continuous sharing of information among the project team, thus D14 can be linked to 'sharing' (PE07). Nevertheless, people tend to respond to change in their

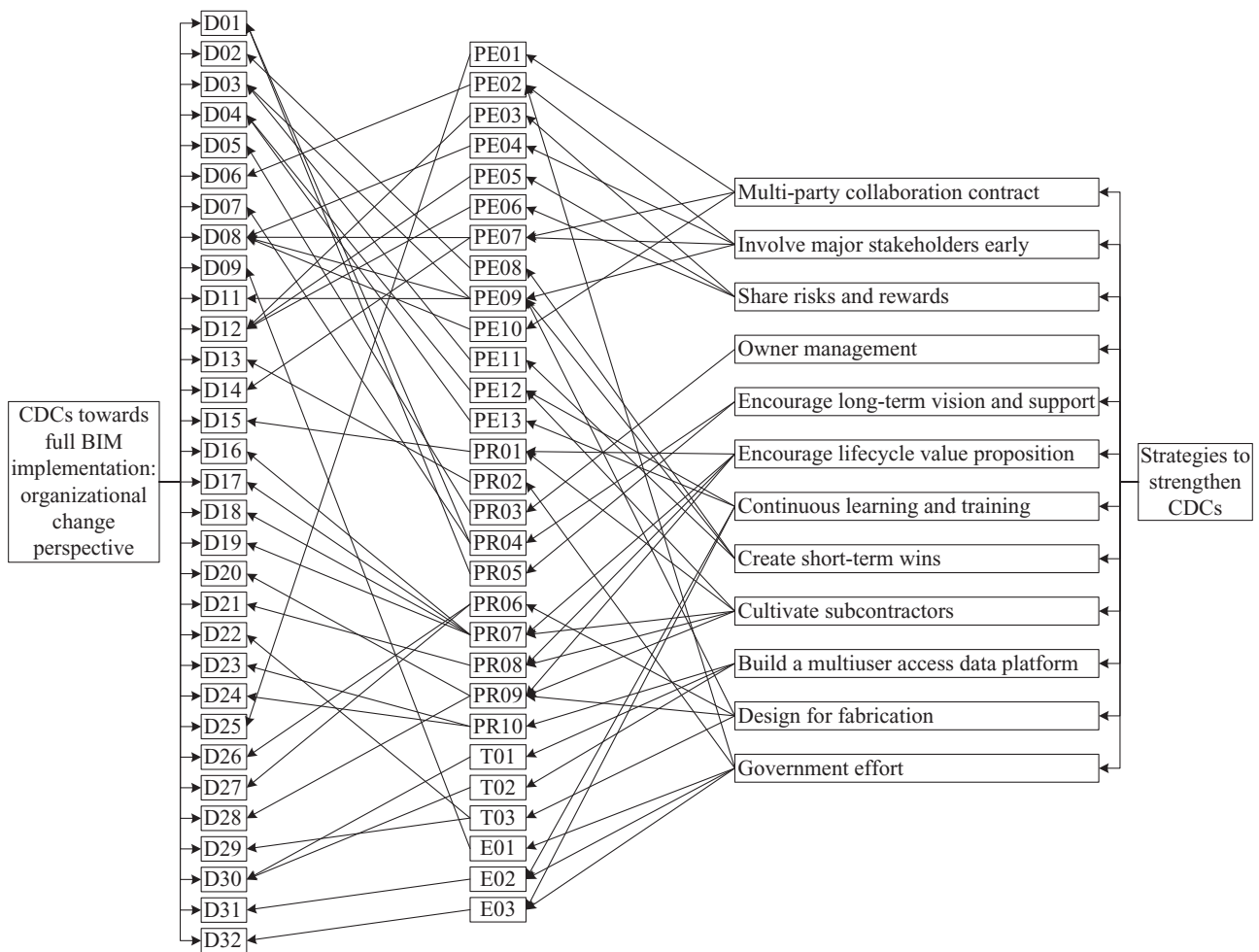


Figure 4. Linking CDCs towards full BIM implementation to attributes of the adapted organizational change framework.

accustomed ways when confronted with change (Low 1998). Such usual practice towards change could be influenced by their trust in and awareness of using the new ways of working such as implementing BIM along with OSM. Thus, D02 represents ‘willingness to change’ (PE08) in the attributes of the organizational change framework, while the CDC ‘all disciplines sharing models in a ‘Big Room’ (D08) motivates the ‘sharing’ (PE07), ‘commitment on new ways’ (PE09), and ‘trust and transparency’ (PE10) in the project team. Also, two significant CDCs (D03 and D11) related to the implementation of BIM and OSM can be linked to ‘commitment on new ways’ (PE09) in the organizational change framework.

In addition, when implementing an organizational change, the change agent must ensure that the relevant individuals are able to adapt to the change (Zhao et al. 2014). The implementers of a transformation are the staff working daily on the shop floor (Autodesk 2012). It is worth reiteration that people tend to harbour a biased view of change that fits most comfortably into a person’s

own perception of the reality (Low 1998). Such negative mindsets toward change may be changed by getting the individuals to understand the advantages of BIM work practices over the traditional drafting practices (Khosrowshahi and Arayici 2012). Thus, D03 could also be associated with ‘mindset and attitude’ (PE11). Nevertheless, the transformation needs new skills and new ways of working. The executives and staff would not actively participate in full BIM implementation or even undermine it if they lack the relevant expertise. Providing ‘training on new skillsets and new ways of working’ (D04) to both the management and the staff would equip them with knowledge and skills (Kiani et al. 2015), representing ‘knowledge, skills, and experience’ (PE12) and ‘training and education’ (PE13) in the organizational change attributes.

Process

In order to hold together the project organization, management processes are necessary (Rockart and Scott Morton 1984). In the design stage, the use of detailed

and accurate 3D models enables the service providers to communicate more clearly and effectively with each other, and with the owner. Fischer et al. (2014) found that it is not uncommon that many owners can only understand 3D models, because they have little or no experience building anything and cannot understand complex two-dimensional shop drawings. Thus, the CDC '3D visualization enabling design communication' (D15) can be associated with 'communication' (PR01). Meanwhile, D13 can be linked to 'controlling and decision-making' since the local BIM standards, guides, and best practices would help the team to control the project throughout the project.

In addition, organizational strategy also plays a critical role in organizational change because of its facilitative nature (Austin and Ciaassen 2008). It should be noted that no established standard fits the situation of every project and its participating firms due to the wide variety of project types and strategic goals. Such governance of standards is not adequate for full BIM implementation in every project. Thus, the 'owner's requirement and leadership to adopt BIM' (D05) is essential, representing 'goals and requirements setting' (PR03). Autodesk (2012) advocated that full BIM implementation is an organizational transformation which starts with executive vision and sponsorship. In order to avoid the pitfalls in a large-scale, radical change such as the change in the building project context, a solid vision should be built. One example of such vision is the long-term competitive advantages that full BIM implementation in this project can give to the service providers to win bids in the future market (Verdecho et al. 2012). Thus, D07 that drives the team to change towards full BIM implementation represents 'vision and mission' (PR04). Ideally, the BIM vision stems from the executives; however, it is common for the mid-tier management to strive to put BIM in the direct focus of the executives and seek for their sponsorship (Autodesk 2012). Therefore, the CDC 'BIM vision and leadership from the management' (D01) can be associated with 'vision and mission' (PR04) and 'top management support' (PR05). In the meantime, the performance improvement on the construction site would also benefit the project team, such as the reduced construction activities, site disruptions, hazard exposures, and site costs resulted from moving on-site activities to a factory environment (Blismas and Wakefield 2009; McFarlane and Stehle 2014). Hence, two significant CDCs (D26 and D27) related to the implementation of BIM along with OSM can be closely associated with 'process alignment' (PR06) in the organizational change attributes.

Although the organizational transformation begins with the vision supported by the management of the

owner and the service providers, it is ultimately carried out through the effort on the shop floor by the individuals who would apply BIM in their day-to-day tasks (Autodesk 2012). The functions of digital information models and the management of the models facilitate the individuals to carry out the tasks, driving full BIM implementation in the project. Specifically, four CDCs (D16-D19) related to the development of optimal design models can be associated with 'coordination and simulation' (PR07). The project team can coordinate the models shared by specific disciplines and perform analysis for sustainability, material selection, constructability, operations, and so on (Eastman et al. 2011; Kunz and Fischer 2012; Chua and Yeoh 2015). Downstream parties can document the design intent and construction intent from the fully coordinated design models. Thus, D21 can represent 'documentation' (PR08). In the meantime, key contractors and manufacturers are able to use the design models shared by the design team as bases for producing their construction models and fabrication models as well as required drawings (Gao and Fischer 2006; Porwal and Hewage 2013). Thus, two CDCs (D20 and D28) can be associated with 'production' (PR09). Furthermore, D23 and D24 can be linked to 'model management' (PR10) which describes the functional and organizational relationships of design, construction, and facility management. Whenever changes (especially unexpected and late scope changes) take place, all these models can be easily updated. More importantly, the project lifecycle implications of the changes can be predicted in the digital models and thus better managed before changes would traditionally occur in the later stages of the project (Gao and Fischer 2006; Khosrowshahi and Arayici 2012).

Technology

Successful organizational change needs constantly advancing technologies which help the participating firms in the project to work more efficiently (Azhar et al. 2014). 'Integrating model management tools with enterprise systems to share data' (D30) can be associated with 'hardware and software solutions' (T01) and 'interoperability' (T02) in the attributes of the adapted organizational change framework. This is because such integration not only facilitates the data sharing in individual parties, but also enables the parties to access the models and exchange data conveniently with each other. Meanwhile, D22 and D29 can represent 'prefabrication' (T03). OSM has emerged as a new construction method and has gained wide recognition in previous studies (Blismas and Wakefield 2009; McFarlane and Stehle 2014). Kunz and Fischer (2012) argued that the project may use automated method to carry out routine design

tasks or to help fabricate more standard building products in a factory. On-site activities would be compressed and result in fewer workers and less waste on sites, reducing costs (McFarlane and Stehle 2014). Therefore, the CDC 'more off-site fabrication and assembly of standard elements' (D22) would motivate the project team to implement BIM fully.

External environment

As mentioned above, the driving forces in the external environment can push the internal components (people, process, and technology) of the project organization into motion until reaching a new equilibrium (Rockart and Scott Morton 1984; Wigand 2007). As the construction market becomes increasingly complex and requires new skill sets and increasing specializations, the Singapore government has been offering the second BIM fund since July 2015 to the local construction industry to subsidize part of the initial costs in training, consultancy, software, and hardware, aiming to motivate BIM-ready firms to grow collaboration capabilities beyond just modelling (BCA 2016). Thus, D31 can be linked to 'changing market' (E02) and 'government support such as subsidizing training, software, and consultancy costs' (D09) can be closely associated with 'policy' (E01) in the attributes of organizational change. Meanwhile, since the technologies related to BIM have been constantly improving, more powerful hardware and a wide range of software applications can be selected to help the project participants to implement BIM fully. For example, computer numerically controlled machines can be used to automate the manufacturing of standard building products for field installation (Kunz and Fischer 2012), driving the team to change to increase the use of OSM. Hence, D32 can be associated with 'new technological solutions' (E03) in the organizational change attributes.

Importance of organizational change attributes for full BIM implementation

Among the top 10 CDCs in the overall ranking of mean scores in Table 4, the aforementioned top three CDCs and overall six positions (D01, D17, D05, D07, D15, and D20) can be interpreted by some of the six organizational change attributes on process aspect, namely 'vision and mission' (PR04), 'top management support' (PR05), 'coordination and simulation' (PR07), 'goals and requirements setting' (PR03), 'communication' (PR01), and 'production' (PR09), respectively; three CDCs (D04, D06, and D03) are linked to 'knowledge, skills, and experience' (PE12), 'training and education'

(PE13), 'leadership' (PE02), 'mindset and attitude' (PE11), and 'commitment on new ways' (PE09) on people aspect; D09 is associated with 'policy' (E01) on external environment aspect. It is notable that none of these CDCs represents the attributes on technology aspect.

Hence, the six organizational change attributes on process aspect are more critical areas in the successful change towards full BIM implementation in the Singapore construction industry. The project management team should prioritize their efforts and resources to these key areas. This result substantiated the argument of Eastman et al. (2011) that the most important driver would be the good information quality provided by the fully coordinated design and construction models. These models enhance visualization and design analyses, facilitate the use of standard building products, and allow for maintenance and operations.

Meanwhile, the project team should not neglect the five attributes (PE12, PE13, PE02, PE11, and PE09) on people aspect. In order to complete the project more efficiently, the owner has to build the knowledge and skills of its service providers such as by introducing training programmes, which facilitates them to adapt to the new ways of designing, building, and managing the building. In addition, the significant attribute 'policy' (E01) on external environment aspect would catalyse the more critical attributes on process and people aspects. It had been no more than five years since the building planning submissions in BIM format became mandatory in building projects in Singapore. Thus, many firms, especially small- and medium- sized enterprises, were still not experienced in delivering their scopes of BIM work (Kiani et al. 2015). So, more incentives from the local government would drive the industry to enhance BIM implementation.

Therefore, as Leavitt's diamond theory and the MIT90s framework indicate, the project team should understand that instead of separating the key areas identified on process, people, and external environment aspects, the interaction and integration between these areas would facilitate more successful changes towards full BIM implementation in the construction industry.

Strategies to strengthen the CDCs

As shown in Figure 4, all the 31 CDCs were interpreted with some of the 29 attributes of the adapted organizational change framework. Based on these interpretation, a total of 12 possible strategies were identified to strengthen the positive influence from these CDCs from the organizational change perspective.

Multi-party collaboration contract

Improving the contractual relationships among the project team is vital since the traditional contractual frameworks lead to adversarial working relationships in implementing BIM (Fischer et al. 2014). A multi-party collaboration contract in the project team enhances the collaboration among all the key participants since it allows and ideally incentivizes the information sharing among the key participants, beyond the design-build team (Kunz and Fischer 2012). Meanwhile, the enhanced relationship may contribute to build the trust in and respect for the other team members. Thus, such a contract can strength the model 'sharing' (PE07) and the 'trust and transparency' (PE10) in the project team as well as the collaborative relationships governed by the widely-used design-build framework (D25) associated with 'contractual relationship' (PE01) in the organizational change attributes.

Involve major stakeholders early

The early involvement of the key stakeholders from the early design stage or even before facilitates the collaboration between the stakeholders and helps to create the optimal digital design models since key contractors and the facility manager can input their construction and operations expertise, respectively, and assist to create models in the design process (Gao and Fischer 2006; Kunz and Fischer 2012). In the early design stage, the regulatory agencies would provide high-level compliance information which leads the project team to implement BIM fully to design, build, and manage the building. Their involvement would significantly avoid the required changes to the design as submitted for permit (AIACC 2014). Thus, the early involvement of the government agencies (D06) enhance the 'leadership' (PE02) in the change towards full BIM implementation in the construction industry, while the other key participants' early involvement can strength the positive influence from the CDC 'all disciplines sharing models in a 'Big Room'' (D08) on 'involvement' (PE04), 'sharing' (PE07), and 'commitment on new ways' (PE09) in the attributes of organization change.

Share risks and rewards

After the major stakeholders are bound by the interlocking collaboration contract, the sharing of risks and financial benefits can force them to be responsible for the whole project rather than trying to escape by shifting the blame to other parties in the project team when a problem occurs (AIACC 2014). This reduces all the stakeholders' anxiety to express their opinion which may help to solve significant project issues. Therefore, the shared risks and rewards can enhance the positive influence

from the 'alignment of the interests of all stakeholders' (D12) on 'reward arrangement' (PE03), 'risk allocation' (PE05), and 'conflict management' (PE06) in the organizational change attributes.

Owner management

It is the owner that makes decisions on whether or not to implement BIM and on the pace of changing towards full BIM implementation in the project organization. The lack of owner request or initiative would limit the interest and willingness of the service providers to implement BIM in practice (Arayici et al. 2011; Kunz and Fischer 2012; Zahrizan et al. 2013). Considering the first cost and apparent risk rather than the potential value as crucial selection criteria would limit the owner's insight into the BIM implementation in the project. Moreover, without the use of BIM in the design, owner-elected changes and their lifecycle implications tend to be costly. Therefore, the owner should rebuild its selection criteria when starting a new project, which strengthens the positive influence from the 'owner's requirement and leadership to adopt BIM' (D05) associated with 'goals and requirements setting' (PR03).

Encourage long-term vision and support

Organizational change starts with executive vision and sponsorship. The senior management of the owner and the major stakeholders is very much encouraged to have the insight into the potential value of implementing BIM over the traditional drafting practices in the project (Khosrowshahi and Arayici 2012), because such value would give them a competitive edge that help win bids in the future market. Meanwhile, the solid vision of the project team can be built through the high-profile communication among all the major stakeholders, not only a few participating firms (Autodesk 2012). The significant CDC 'gaining competitive advantages from full BIM use' (D07) representing 'vision and mission' (PR04) can be strengthened by such a solid project vision. On the other hand, the top management needs to convey the vision to the staff working on the shop floor where the project vision is realized. Without the leadership and support from the top management, the staff cannot get the energy in the organizational transformation. This was consistent with the survey finding that the respondents cited the 'BIM vision and leadership from the management' (D01) as their top motivation. Thus, the long-term vision and support can enhance the positive influence from the top CDC (D01) associated with 'vision and mission' (PR04) and 'top management support' (PR05) in the attributes of organizational change.

Encourage lifecycle value proposition

In the project organization, the architect, engineers, and contractors tend to be stuck to the cost minimization of delivering their scopes of work, but rarely try to maximize the value of their work (Kunz and Fischer 2012). Previous studies (Sattineni and Mead 2013; Lam 2014) noted that the project delivery currently adopted in the construction industry would cause many issues such as inefficient processes, repeated efforts, and liability anxieties; for example, it is common for the architecture and engineering team to create one design model, and for the main contractor and specialty contractors to develop their own model based on the information provided to them. This is because the design model is created without considering downstream uses and the contractors are not involved in the design process, which does not maximize the value of the design work. In contrast, full BIM implementation requires the architectural model to be shared with the engineers for creating their models on the same design; the key contractors are also involved in the design stage and get the design models as bases for creating their construction models (Gao and Fischer 2006; Porwal and Hewage 2013). This process would create constant value throughout the project. In addition, periodical project meetings can be arranged to enhance the BIM use in the day-to-day activities on the shop floor to realize the vision. Thus, this strategy can strengthen the positive influences from seven CDCs (D15-D21) associated with management processes and daily tasks, namely 'communication' (PR01), 'coordination and simulation' (PR07), 'documentation' (PR08), and 'production' (PR09) in the organizational change attributes.

Continuous learning and training

Full BIM implementation in the project organization is a process of continual examination and improvement. It also requires continuous learning and testing of sometimes new and misunderstood BIM concepts (Autodesk 2012), so the project team needs continuous training to support the adoption of BIM into the daily work. As support from the management, project-wide training programmes can be arranged by the owner and in-house education by individual parties (Azhar et al. 2014; Kiani et al. 2015). Such programmes would motivate the participants and build up valuable intellectual capital in the organization. Thus, this strategy can strengthen the significant CDC 'training on new skillsets and new ways of working' (D04) pertaining to 'knowledge, skills, and experience' (PE12) and 'training and education' (PE13), and enhance the grasp of new technological skills (D32 and E03) and the adaption to the complex and changing market (D31 and E02).

Create short-term wins

After the training and staggering start of implementing BIM in the project, creating milestones would help the project organization to overcome the initial paralysis of continually carrying out BIM practices (Autodesk 2012). Once accomplished, the short-term milestones can generate energy and motivate the major participants to implement their part of BIM in changing towards full BIM implementation in the project (Khosrowshahi and Arayici 2012; Kiani et al. 2015). The short-term wins can convince the management team and the staff that the BIM implementation in their project can add value rather than increase cost and risk (Teo and Heng 2007; Zhao et al. 2014). Therefore, this strategy drives the project organization to conduct cultural change to obtain advantages over the competitors (Arayici et al. 2011; Azhar et al. 2014; Kiani et al. 2015), strengthening the CDC 'stakeholders seeing the value of adopting their own part of BIM' (D03) representing 'commitment on new ways' (PE09) and 'mindset and attitude' (PE11) and the CDC 'changes in organizational structure and culture' (D02) associated with 'willingness to change' (PE08) in the organizational change attributes.

Cultivate subcontractors

The large number of specialty contractors engaged in the project tend to lack adequate knowledge and skillsets to implement BIM and thus appear to still be happy to submit their drawings in traditional drafting format (Lam 2014). Thus, if the other stakeholders cultivate the subcontractors by spearheading the model development, visualization, coordination, and simulation for them, a number of management processes and daily tasks can be efficiently completed to truly realize the solid vision of implementing BIM fully in the project. For example, the MEP specialty contractors can contribute their construction expertise in the creation and coordination of MEP design models, which in turn guides their construction work on site (Khanzode et al. 2007). Thus, this strategy provides further evidence to enhance the positive influence from D04 representing 'knowledge, skills, and experience' (PE12) and from the seven CDCs (D15-D21) pertaining to four organizational change attributes (PR01 and PR07-PR09).

Build a multiuser access data platform

In order to strengthen the information exchange and management, the project team may build a data platform that allows all the key participants to access and link it with their own data management systems. For instance, this platform would facilitate to upload submittals by the main contractor and specialty contractors, provide feedback by the owner and the design team, update the

design models to deal with changes and their lifecycle implications, and retrieve the latest models and documents. Thus, the positive influence from two CDCs (D23 and D24) associated with 'model management' (PR10) and from the CDC 'integrating model management tools with enterprise systems to exchange data' (D30) pertaining to 'hardware and software solutions' (T01) and 'interoperability' (T02) can be enhanced by such a data platform.

Design for fabrication

Changing the design philosophy that was based on traditional methods plays an important role in the organizational change (Blismas and Wakefield 2009). The early involvement of the contractors and suppliers facilitates the design for maximizing off-site production and assembly and leaving minimum assembly work on site (McFarlane and Stehle 2014). This would optimize manufacturing functions, standardize design and manufacturing processes, reduce safety risks in a factory environment, ensure maximum quality, and simplify construction processes (Belay 2009). Thus, this strategy would strengthen the positive influence from D11 associated with 'commitment on new ways' (PE09), from two CDCs (D26 and D27) representing 'process alignment' (PR06), from D28 associated with 'production' (PR09), and from two CDCs (D22 and D29) representing 'prefabrication' (T03) in the attributes of organizational change.

Government effort

The lack of government involvement as well as national standards and guidelines for contractors is another concern (Zahrizan et al. 2013). Cheng and Lu (2015) observed that Singapore is a leading country for standards development in Asia because the local government had developed 12 out of the 35 BIM standards in Asia. For example, the second version of the Singapore BIM guide was released by the BCA in 2013 to outline the roles and duties of the major stakeholders in implementing BIM at different stages of the project (BCA 2013). Meanwhile, the Singapore government has incentivized the industry to adopt productive technologies such as prefabricated volumetric construction to manage the future requirements of the changing industry. A greater extent of OSM has been stipulated as part of the tender conditions for industrial government land sales sites (Ministry of Finance 2014). Hence, the continuous efforts made by the government will largely strengthen the 'leadership' (PE02) by the government (D06), the BIM governance of related policies and standards (D13) associated with 'controlling and decision-making' (PR02), the 'government support such as subsidizing training, software, and

consultancy costs' (D09) representing 'policy' (E01), and two CDCs (D31 and D32) pertaining to 'external economic and technological environment' in the adapted organizational change framework.

Conclusion and recommendation

This study has interpreted full BIM implementation in the Singapore construction industry from an organizational change perspective. Through the comprehensive literature review, 32 drivers for change towards full BIM implementation were identified. The questionnaire survey was performed in the Singapore construction industry to collect the data related to the influence of these drivers on changing towards full BIM implementation. The analysis results indicated that 31 drivers had significant influence. In addition, conceptualizing full BIM implementation in the building project context as an organizational change, this study interpreted the 31 CDCs with an organizational change framework adapted from existing organizational change theories. Specifically, all the 29 attributes in the adapted framework were linked to some of the 31 CDCs. It was found that while the attributes on process aspect are the most influential, the attributes on people and external environment should be considered in the meantime for the overall success of the organizational change in the building project context. Lastly, 12 strategies were identified to strengthen the CDCs towards full BIM implementation.

Although the objectives were achieved, there were some limitations to the conclusions. First, the 32 drivers identified from the literature review may not be exhaustive enough or continue to hold true as time passes. Second, the single-source data collected in the Singapore construction industry are likely to cause common method biases (Jiang and Wang 2014; Jiang and Jiang 2015), which is a common limitation of studies using questionnaire surveys (Zhao et al. 2016). In addition, the findings from this study were well interpreted in the Singapore context, which may differ from the context of other countries. Nevertheless, the theoretical and practical implications drawn from this study are not limited to the building projects in Singapore. It should be noted that the theoretical rational behind the CDCs can be used globally to interpret the drivers for change towards full BIM implementation in building projects. Additionally, overseas project teams can use the drivers and their associated strategies identified in this study to customize their own lists of drivers and strategies to strengthen the drivers, because other countries also tend to encourage or specify the BIM implementation in their construction and building projects (Smith 2014). In addition, since little research has been carried out to investigate full BIM

implementation in the construction industry as an organizational evolution, this study interpreted the CDCs towards full BIM implementation with the adapted organizational change framework, thus expanding the existing literature related to BIM implementation.

Future publications for this study would conduct in-depth case studies that may disclose how project teams manage the positive influence from the CDCs to diminish the negative influence of the non-value adding activities carried out by the major stakeholders in the building projects in Singapore. Apart from the lack of contractor input in the design stage, plenty of other non-value adding activities exist in the current industry practices, such as no pre-agreed business interests sharing arrangements from the beginning and low proportion of building components being completed with OSM during construction. Non-value adding work holds a considerable portion in most construction processes and even exceeds 50% of the total work in some cases (Nikakhtar et al. 2015). Thus, a comprehensive checklist of the non-value adding activities in different project stages in the Singapore construction industry should be developed. Such activities usually cause detrimental inefficiencies such as design errors, requests for information, change orders, and reworks in the project lifecycle (Chelson 2010), significantly hindering the change towards full BIM implementation in the construction industry. A set of key inefficiencies for the local building industry should also be established. The identification of the non-value adding activities and inefficiencies would be valuable for evaluating the change performance in these case projects, which in turn would purposely and efficiently guide the project teams to change towards full BIM implementation. Using the outcomes, specific action plans would be identified to reduce the non-value adding activities.

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