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Abstract

Purpose - Digital twin (DT) and building information modeling (BIM) are interconnected in some ways. However, there has been some misconception about how DT differs from BIM. As a result, industry professionals reject DT even in BIM-based construction projects due to reluctance to innovate. Furthermore, researchers have repeatedly developed tools and techniques with the same goals using DT and BIM to assist practitioners in construction projects. Therefore, this study aims to assist industry professionals and researchers in understanding the relationship between DT and BIM and synthesize existing works on DT and BIM.

Design/methodology/approach - A systematic review was conducted on published articles related to DT and BIM. A total record of 54 journal articles were identified and analyzed.

Findings - The analysis of the selected journal articles revealed four types of relationships between DT and BIM: BIM is a subset of DT, DT is a subset of BIM, BIM is DT, and no relationship between BIM and DT. The existing research on DT and BIM in construction projects targets improvements in five areas: planning, design, construction, operations and maintenance, and decommissioning. Additionally, several areas have emerged, such as developing geo-referencing approaches for infrastructure projects, applying the proposed methodology to other construction geometries, and creating 3D visualization using color schemes.

Originality/value - This study contributed to the existing body of knowledge by overviewing existing research related to DT and BIM in construction projects. Also, it reveals research gaps in the body of knowledge to point out directions for future research.

Keywords Digital twin, BIM, facilities management, built environment, literature review **Paper type** Literature review Digital twin (DT) is a concept that involves gathering real-time data to monitor a physical asset and improves operational efficiency enabling predictive maintenance and better decision-making (Khajavi et al., 2019). DT has been launched as the fourth wave of technological advancement (Industry 4.0) continues to evolve. Massive data is generated during the construction project phases, from the conceptual design phase until decommissioning phase (Bilal et al., 2016). However, the huge amounts of data created by each construction project cannot be properly communicated and interpreted by the stakeholders, resulting in confusion and reworks (Gunduz et al., 2013). Therefore, project data must be appropriately handled and communicated to be effectively disseminated to all stakeholders as well as to improve project performance (Bond-Barnard et al., 2013). DT can address those issues by allowing construction project stakeholders to interact more effectively as a team (Pan et al., 2021). In other words, not adopting DT in construction projects may lead to inefficient data communication between project stakeholders (Tao et al., 2018). However, the benefits of DT cannot be exploited in the construction industry unless practitioners have the required knowledge. Therefore, practitioners must grasp the required knowledge to avoid incorrect implementation of DT in construction projects.

Over the past two decades, building information modeling (BIM) has become an essential innovation in the construction industry (Wang and Lu, 2021). By reducing inefficiencies, boosting productivity, and increasing communication among project stakeholders, BIM has the potential to revolutionize and improve construction project performance (Abanda et al., 2018). BIM enables design visualizations, rapid creation of design options, automated model reliability analysis, report generation, and asset performance predictions (Sacks et al., 2010). In other words, both DT and BIM have the potential to alleviate many construction project issues and enhance project performance (Volk et al., 2014). However, humans often assume DT and BIM to be distinct from one another, although they are interconnected in some ways (Badenko et al., 2021). As a result of these misconceptions, practitioners are hesitant to explore DT if BIM is already present in their construction projects. Furthermore, not understanding the differences can result in inappropriate usage of DT and BIM in construction projects. Therefore, understanding the relationship between DT and BIM is crucial to avoiding inefficiencies and reduced productivity in construction projects.

To understand DT and BIM in construction projects, there has been an increase in publications related to both subjects in the last few years. However, a quick review of prior works

illustrates different interpretations of the relationship between DT and BIM. Prior works are also developing tools and techniques with the same goals. These problems arise from a lack of knowledge about what has been developed. In addition, construction industry practitioners are hesitant to adopt DT due to their unfamiliarity with the differences between DT and BIM. Given the significant amount of work that has been done in this field in the last few years, an overall perspective on the direction of prior efforts is required. By overviewing these diverse efforts, researchers can have a more comprehensive knowledge of the relationship between DT and BIM. Researchers can also use the information to identify knowledge gaps on the subject before planning further research. Additionally, industry practitioners can use the information to determine appropriate tools and techniques for their projects. Therefore, there is a need to summarize all relevant work related to DT and BIM in the construction industry for industry practitioners and researchers.

This study aims to identify the relationship between DT and BIM, analyze evolution trends in the DT research area, and identify the potential outcomes for future directions. To achieve that aim, the study conducts a systematic literature review of published research articles related to DT and BIM in construction projects. As a result, researchers can gain a more thorough understanding of the relationship between DT and BIM. In addition, researchers can also make use of the information to determine knowledge gaps on the subject before embarking on new research. Industry practitioners can use the data to identify whether tools and procedures are appropriate for their projects.

2. Background

2.1. Digital Twin

The concept of a DT may be applied to a wide range of industries and technology (Daily and Peterson, 2017). A DT is a virtual representation of a physical asset, process, system, or service used to understand and predict future difficulties over its life cycle (Qi and Tao, 2018). The physical twin, the digital model, and the linkage between them are the three basic components of a DT (Glaessgen and Stargell, 2012). These components work together to provide real-time monitoring, visualization of data, data analysis, and 'what-if' simulation to anticipate future difficulties, as well as provide beneficial understandings and possibilities. DT was initially introduced in the context of product life cycle management (Grieves, 2011). Since then, it has

since been widely used in the aviation and aerospace industries to simulate vehicle conditions, systems, and operations (Glaesgenn and Stargel, 2012). Consequently, DT is used in different industries, including robotics, health monitoring, and manufacturing. In the construction industry, the significant benefits of creating a DT of a constructed facility include acquiring, generating, and visualizing the asset's environment, assessing data anomalies, and optimizing services (Nasaruddin et al., 2018).

2.2. Building Information Modeling

BIM is a digital representation of what will be built in a construction project (National BIM Standard, 2020). The architecture, construction, engineering, and facility management can benefit from the adoption of BIM in terms of visualization of the design, detection of design clashes, estimation of time and cost, and improvement of interoperability among stakeholders (Volk et al., 2014). The industry has embraced BIM because it helps to maintain a good balance in the project management triangle (i.e., scope, cost, and time) (Olawumi et al., 2018). In addition, BIM can mimic operations management on a site during construction, which can help to assist and optimize project scheduling (Coraglia et al., 2017). During the design and construction of a project, BIM is utilized to improve resource efficiency (Volk et al., 2014; Liu et al., 2012), knowledge exchange (Tang et al., 2010), and avoid costly design errors (Tang et al., 2010; Succar, 2009). BIM has evolved over the course of its existence. According to the BIM maturity model, BIM started with Level 0 BIM in 1990 with CAD modeling software, and during the 2000s, BIM evolved to Level 1 BIM and Level 2 BIM. As for now, Level 3 BIM is currently being developed (Khajavi et al., 2019).

2.3. Comparison between DT and BIM

DT and BIM can be compared in detail based on various aspects. First, DT is defined as a connected and synchronized digital representation of assets, processes, and systems to understand and predict potential issues across its life cycle (Qi and Tao, 2018). Meanwhile, BIM is a digital representation of what will be built in a construction project (National BIM Standard, 2020) with no real-time synchronization. Generally, the concept of DT focuses on the interaction of people with built environments. In contrast, BIM is used for visualization in the design phase and construction phase rather than in the operations and maintenance phase. DT and BIM both have

separate beginnings. DT originates from NASA's Apollo program to keep a physical twin of the crew module on the ground to recreate scenarios and resolve any difficulties that the spacecraft may encounter in space. (Schleich et al., 2017). Meanwhile, Charles M. Eastman pioneered the idea of BIM in the 1970s (Sacks et al., 2018). BIM was initially applied in the RUCAPS CAD system for the design and construction of London Heathrow Airport Terminal 3 (Aish, 1986). DT and BIM are beneficial in the construction industry for many reasons. DT can be used for predictive maintenance, tenant comfort improvement, scenario, and risk analysis as well as it can enhance the decision-making process (Qi and Tao 2018). Meanwhile, BIM is primarily used to eliminate errors in design, enhance stakeholder communication, improve construction efficiency, and track the duration and cost of a construction project (Volk et al., 2014). During the operations phase, facility managers use DT to enhance its operation. In addition, architects can design future facilities by using the information from the detected flaws and improvement areas unveiled during operations and maintenance. Meanwhile, architects, engineers, and constructors are the users of BIM who use it throughout the design and construction phases (Eastman et al., 2011; Sacks et al., 2018). Moreover, facility managers employ BIM for maintenance planning throughout the asset life cycle (Azhar et al., 2012). Table 1 summarizes the similarities and differences between DT and BIM. dr.

Table 1. Differences between DT and BIM

2.4. Positioning this study

This subsection summarizes the knowledge gaps that exist in the current literature to support the rationale for conducting the study. Previous works have advanced the current body of knowledge and practice by analyzing the benefits of DT and BIM in construction projects. However, the works were in silos. Thus, the relationship between DT and BIM has not been comprehensively explored. Therefore, the current study addresses that research gap by investigating the relationship between DT and BIM.

3. Methodology

The current body of knowledge still lacks an overview of the relationship between DT and BIM in construction projects. Therefore, this study conducted a systematic literature review (SLR) of prior publications on the subject matter. The main advantage of SLR is its transparency, which

allows other researchers to repeat it. SLR is also useful for obtaining a broad overview of an issue, giving researchers and practitioners evidence-based insights into a particular topic or research problem (Petersen, 2019). Figure 1 shows the SLR process that narrows the study from 285 articles to 54 articles over three sequential screenings.

Figure 1. Summary of SLR procedures

The Scopus database was used to retrieve research articles related to DT and BIM in construction projects published between 2018 and early 2022 (January). Scopus was selected as the search engine because it has a large database of publications from different fields, including management, accounting, engineering, business, and construction (Hong and Chan, 2014). Scopus is also the database that contains the most abstracts and citations globally, covering 15,000 journals from 4000 publishers (Li et al., 2020). A systematic desktop search was conducted by identifying and choosing relevant articles related to DT and BIM in construction projects. After choosing the search keywords, a desktop search was conducted using the "article title/abstract/keywords" field. The search query was designed to include "digital twin," or "digital twins," and "building information modeling," "building information modelling," or "building information model".

Using the search string, 285 articles were retrieved from the Scopus database. Only 138 articles remained after the book chapters, and conference articles were removed. Conference papers and thesis dissertations were excluded due to the possibility of inadequate quality (Abdul Nabi and El-adaway, 2020). Moreover, all the selected articles are peer-reviewed journal articles because journal articles undergo peer review. In contrast, other types of publications do not undergo the same rigorous review before publication (Olawumi and Chan 2018). Subsequently, the selected articles were screened by reviewing the abstracts, keywords, and titles. In total, 69 articles were excluded. Not all of the articles were directly related to DT and BIM in construction projects. Thus, articles that do not meet design criteria were eliminated following a thorough examination of their content. Consequently, a total of 54 articles were found to be valid for further investigation.

4. Overview of existing research related to DT and BIM

Figure 2 illustrates the annual number of publications from the selected journals from 2018 to early 2022. Research in this field has grown slowly, with the increase of only two publications between

2018 and 2019. In 2020, research related to DT and BIM began a noticeable upswing, with the body of literature steadily growing over the following years. It should be noted that the number of publications in 2022 is not shown in the figure since only three publications were recorded because the search was finalized in early January 2022. Table 2 shows a summary of the publications from the SLR conducted. Sustainability is the leading publisher with seven publications, followed by Applied Sciences (six publications), Automation in Construction (five publications), Journal of Management in Engineering (three publications), and Advances in Civil Engineering (three publications).

Figure 2. Publication year of the selected articles

 Table 2. Summary of selected articles used for this study

5. Results

5.1. Relationships between DT and BIM

After analyzing the articles based on the search string in the Scopus database, only forty articles wrote about the relationship between DT and BIM. Consequently, four types of relationships between DT and BIM have been discovered. The relationship can be classified into (1) BIM is a subset of DT; (2) DT is a subset of BIM; (3) BIM is DT; and (4) no relationship between DT and BIM. Figure 3 summarizes the identified relationship between DT and BIM.

Figure 3. Summary of the relationship between DT and BIM

5.1.1 BIM is a subset of DT

There are twenty-four articles that view BIM as a subset of DT. Porsani et al. (2021) stated that BIM is the first step toward industrial revolution 4.0, which includes virtual reality and DT as major components. Integrating as-designed and as-built BIM models in DT information systems might improve organizational operations (Gurevich and Sacks 2020). The construction industry depends on as-built data and 3D geometry from BIM to create DT (Rausch et al., 2021). Antonino et al. (2019) demonstrated that DT could be developed by integrating real-time information and BIM. In addition, DT smart cities can be created by combining BIM with large data from IoT in smart cities (White et al., 2021) and GIS (Geographic Information System) (Zhu and Wu 2021b).

Developing a historic building information model (HBIM) may result in an informative DT of heritage architectures (Youn et al., 2021; Jouan and Hallot, 2020).

5.1.2 DT is a subset of BIM

Only three articles consider DT as a subset of BIM. DT is a multidimensional and digital representation of physical assets, systems, and processes that can speed up the development and benefit of BIM in the construction industry (Moretti et al., 2020). The component information of existing facilities could be mapped and stored using DT, which maintains a high degree of correlation and consistency on the facility components in BIM (Zhao et al., 2021). The arrival of the concept of DT in BIM can improve the safety and efficiency of decommissioning nuclear power plants (Oti et al., 2021).

5.1.3 BIM is DT

Six articles used DT as a synonym for BIM. Schimanski et al. (2019) stated that BIM is DT and is the main factor that allows better processes in the construction industry. Kaewunruen et al. (2020) suggested that DT, or so-called BIM, has brought a great revolution to the construction industry. The same first author (Kaewunruen) also used similar definitions in other publications (e.g., Kaewunruen and Xu 2018; Kaewunruen and Lian, 2019; Kaewunruen et al. 2019; Kaewunruen et al. 2021). Kaewunruen stated that DT or BIM is in great demand and is not only a tool but also a process that can aid in transforming the construction industry (Kaewunruen and Xu 2018). For example, integrating BIM or DT with sensors allows for real-time monitoring of bridge operations (Kaewunruen et al., 2021). In addition, developing DT or BIM can enhance collaboration among project participants and accurately estimate costs and technical issues encountered by producing net zero energy buildings (NZEB) in pre-determined locations. (Kaewunruen et al., 2019).

5.1.4 No relationship between BIM and DT

Seven articles view DT and BIM as two separate subject matter (i.e., no relationship between DT and BIM). Sacks et al. (2020) stated that DT is different from BIM as BIM only replicates the physical twin, but DT is also connected and automatically updated to the physical twin. Lee et al. (2021a) and Xie et al. (2020) also suggested that compared to BIM, DT is an up to

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current modeling with a broader concept in terms of information richness and decision-making capability. Alizadehsalehi and Yitmen (2021) suggested that DT is helping BIM processes by automatically updating and creating the digital model of a construction project. Badenko et al. (2021) stated that although DT and BIM focus on creating and linking a digital model to its physical twin, DT and BIM have different development paths (Badenko et al., 2021). Liu et al. (2021) stated that DT and BIM could be combined to enhance the efficiency of safety management. O'grady et al. (2021) suggested the integration of DT in virtual reality environments through the facilitation of BIM to enhance the applicability of circular economy strategies.

5.2 Existing studies

Numerous prior works have been conducted related to DT and BIM. After collecting and analyzing the fifty-four articles, five sub-themes have been established. As shown in Figure 4, the subthemes can be further classified into five phases of facility life cycle, which are planning, design, construction, operations and maintenance, and decommissioning.

Figure 4. Themes of the selected articles with number of publications

5.2.1 Planning phase

The integration of BIM and GIS can helps solve multiple issues in the phase of planning, designing, and analyzing construction projects (Ninić et al., 2017). One of the challenges in integrating BIM and GIS is storage inefficiency which can lead to burdens in data exchange and analysis (Deng et al., 2016). To solve storage issues, Pan et al. (2021) developed a hierarchical data format (HDF) based data compression and integration approach to support BIM-GIS applications. Another obstacle is the issue of geo-referencing digital models in a GIS environment. Thus, Diakite and Zlatanova (2020) proposed an automated framework to convert local coordinates of digital models into real-world geographic coordinates. In addition, Zhu and Wu (2021a) developed a standard geo-referencing technique that can be used with current and future industry foundation classes (IFC). Another issue is the problem of converting BIM data to GIS data due to the intrinsic differences between BIM and GIS. To solve the problem, an approach for converting IFC to shapefile utilizing computer graphics technology was developed by Zhu and Wu (2021b).

In prefabricated construction, information flow is an important factor in planning and controlling production. Thus, Teisserenc and Sepasgozar (2021) developed a conceptual model involving implementing blockchain with DT, BIM, and IoT to enhance trust, cyber security, efficiencies, information management, information sharing, and sustainability. There is still a lack of research on the information management of a DT, including data storage, security, and sharing. Thus, Lee et al. (2021b) integrated DT and blockchain to develop a framework that can selectively store and share relevant project information as well as trace that information back to its source. Occupational health and safety management in construction projects is complex. Thus, Torrecilla-Garca et al. (2021) presented a framework to improve strategic developments of solutions for safety planning and management of construction projects.

As schedule deviation in the logistics of prefabricated construction can hinder its advantages and prevent its widespread use, Lee and Lee (2021) developed a framework that integrates DT with BIM and GIS for real-time logistics monitoring and simulation. Schimanski et al. (2019) use computational design and digital fabrication techniques to develop a digital process flow that can help save time during the bid estimation phase and the preparation of work. The absence of a reliable approach for assessing embodied carbon in the AEC industry has hampered the advancement of low-carbon design in the sector. Therefore, Chen et al. (2021) proposed a DT-based life cycle assessment (LCA) approach to measure embodied carbons of constructed facilities, consequently expanding the current LCA from a partial life cycle to a whole-life cycle. In addition, Badenko et al. (2021) developed a framework called "Factories of the Future" to investigate the integration methods, develop appropriate principles and methods, and assess the interpenetration effectiveness of DT and BIM.

Net zero energy building (NZEB) is one method for reducing energy usage in constructed facilities, which involves fulfilling energy demands entirely through renewable energy sources. Hence, NZEB is one of the critical components for a more sustainable future. Therefore, Kaewunruen et al. (2018) proposed a new hierarchy flow chart for a digital model to emphasize the technical and financial viability of NZEB for existing facilities. In addition, Zhao et al. (2021) proposed a technique that uses scan-to-BIM and DT to evaluate NZEB retrofitting schemes by analyzing energy consumption and carbon emission indicators of existing facilities using scan-to-BIM and DT.

Urban planning and policy decisions can be modeled using the data generated by DT. In 2021, White et al. used a publicly released model of an area in Dublin to create its DT. The information from the DT can be used in the planning of the urban area and policy decisions. Besides, DT of airports can improve performance and efficiently obtain data (Oliveira 2020). In addition, Kaewunruen et al. (2020) created a DT of subway stations to simulate their design, construction, and operations and maintenance processes and assess the life cycle assessment of the stations. Furthermore, Kaewunruen and Lian (2019) analyzed the world-first 6D BIM for the life cycle management of a railway turnout system. The government and other public procurement bodies are requiring the use of BIM, consequently driving its adoption. To guide construction stakeholders on BIM adoption, Kaewunruen and Xu (2018) used a Revit-based simulation to discuss BIM application within the context of railway stations.

5.2.2 Design phase

There is still a lack of basic knowledge of the linkages between design, detailed modeling, and fabrication automation. Therefore, He et al. (2020) developed a customized application that works with BIM authoring tool to generate the precise geometry models of the 3D-printed modules, allowing users to check and resolve interferences at the early stage. Data loss while transferring data between BIM and BEM is a major issue leading to reworks. Thus, Porsani et al. (2021) proposed a semi-automated workflow from BIM to BEM that could improve the design process. In addition, Demianenko and De Gaetani (2021) proposed a system for simulating renovation scenarios that incorporated BIM and artificial neural networks (ANN)-based models to predict the total energy consumption, life cycle cost, and life cycle assessment.

The existing digital model of historical assets is a theoretical model often built by facility managers using basic geometries and does not take into account structural transformations induced by time or natural events. Therefore, Moyano et al. (2022) developed a new technique to review visual recordings and analyze structural deviations. Besides, Youn et al. (2021) determined the critical factors in converting 3D scan data of Korean traditional wooden architectures into HBIM data by investigating the modeling processes of wooden bracket sets. Hence, HBIM models can be used as a DT to comprehend deformation and damage in wooden joints.

5.2.3 Construction phase

DT provides facility owners with real-time information, allowing owners to make more informed decisions based on facts rather than assumptions. A new mode, "Digital twin construction (DTC)," was formulated by Sacks et al. (2020) for managing production in construction by providing accurate status information and proactively analyzing and optimizing ongoing design, planning, and production. Pan and Zhang (2020) developed a framework by integrating BIM, IoT, and data mining techniques for controlling and optimizing complex construction processes under a high degree of automation and intelligence. Alizadehsalehi and Yitmen (2021) developed a framework for automating construction progress monitoring through reality capture to extended reality allowing digital construction progress monitoring. Zhang et al. (2022) enhance the DT concept as well as extends the existing level of details of BIM for construction site management by presenting a framework that integrates BIM, IoT, and data storage. Particulate Matters (PM) exposure has been linked to major health issues, including inherited genetic damage (Morakinyo et al., 2017). Therefore, Khan et al. (2021) integrated lowcost dust sensors with BIM to generate a DT for automated dust control techniques on the construction site. The most common accidents for hoisting activities during construction include falling and suffering from mechanical or component collisions (Maryam et al., 2017). Thus, Liu et al. (2021) proposed a model that integrates IoT, BIM, and a security risk analysis method to complete the information fusion process between the hoisting site of a physical twin and its digital model.

5.2.4 Operations and maintenance phase

According to Christensen et al. (2014), occupancy data can be used to optimize the energy usage of systems and equipment. Therefore, Antonino et al. (2019) proposed a technique for detecting human motions in crowded environments and measuring exact real-time occupancy data using image recognition sensors and computer vision. Also, Seghezzi et al. (2021) discussed the stages of IoT system calibration, which include preliminary analyses to optimize the design of IoT camera-based sensors systems and test campaigns to verify system efficiency and accuracy in monitoring occupancy. Desogus et al. (2021) presented a method for integrating IoT sensors with and of BIM processes to create a single data platform for the visualization of indoor conditions and energy consumption metrics.

Existing digital models do not fully connect with the IoT data of their physical twins. Therefore, Villa et al. (2021) developed a framework composed of IoT sensors, dashboard, IoT, and BIM for monitoring and visualizing the conditions of constructed facilities throughout operations and maintenance virtually. Educational environment comfort is a critical factor in learning success and social progress (Zomorodian et al., 2016). Thus, Zaballos et al. (2020) developed a smart campus concept involving BIM and IoT-based wireless sensor networks that allows environmental monitoring and emotion detection systems to provide insights into indoor comfort. The indoor environment is a critical aspect of human life, health, and well-being (Asadi et al., 2017). Therefore, Xie et al. (2020) developed an AR-supported automated environmental anomaly detection and fault isolation method to address problems that affect indoor thermal comfort. Integrating BIM and IoT can lead to more immersive virtual reality environments, intuitive visualizations, and higher levels of interactivity during indoor comfort assessment. Thus, Shahinmoghadam et al. (2021) proposed a virtual reality application to identify the benefits of virtual reality, BIM, and IoT for real-time monitoring of indoor thermal comfort. In addition, Liu et al. (2020) proposed a framework that integrates BIM, IoT, and support vector machines to enhance the level of intelligence of indoor safety management. Furthermore, Abdelrahman et al. (2022) developed Build2Vec, which is a prediction model that predicts spatial-temporal indoor environmental preferences.

5.2.5 Decommissioning phase

Nuclear power plants have continued to be constructed and operated worldwide due to their low capital costs and benefits to global warming mitigation. Decommissioning is a critical phase in nuclear plant operation for assuring the safety and security of radioactive products and byproducts. Thus, Oti et al. (2021) proposed a framework for a more regulation-aware and safer decommissioning of nuclear power plants. The circular economy (CE) is an approach to optimize the recycling process of construction materials. CE allows construction material transition from a conventional model to a model involving the life extension of resources as well as enabling materials to stay in the loop. Therefore, O'Grady et al. (2021) proposed the application of CE principles to construction projects by integrating the related principles with BIM and virtual reality tools.

6. Future directions

Based on the systematic review of the selected articles, several areas that need further research have been revealed (Figure 5). However, these future areas are only suggestions or compilations from the identified research articles in this study. Therefore, these findings should not be limited to other future explorations in the construction domain.

Figure 5. Framework to link existing research areas to future directions

Several works suggest adding additional data as well as specific information in future research. For instance, White et al. (2021) suggested that the public data used for the DT simulations can be supplemented with data from additional IoT services in the area. Along with more data, the simulation will be more realistic with real-time information about noise pollution, traffic, and crowds. Pan and Zhang (2021) recommend future researchers use information fusion by collecting and merging multiple sources of monitoring data. Moreover, Zhao et al. (2021) suggested that researchers should apply more retrofitting technologies to existing buildings and provide more financial data as well as more data integration into the established BIM. Liu et al. (2021) recommended that more validation data samples should be collected.

There are researchers that suggest future scholars expand their current research. Oti et al. (2021) proposed to appropriately classify and map all traditional decommissioning tasks by dissecting the multiple rules and requirements. Furthermore, Chen et al. (2021) suggested that the developed framework can be expanded into a system for estimating embodied carbon in buildings. According to Liu et al. (2020), the proposed framework can be expanded by focusing more on risk assistant treatment, as well as considering other dangers in the indoor environment. Moyano et al. (2022) recommended focusing on applying the Structure from Motion technique in the analysis, behavior, and diagnosis of humidities, as well as in experimentation linked to architectural elements.

Some prior works also suggested future scholars test and validate the developed framework and methodology. For instance, Moretti et al. (2020) suggested that future scholars should test the proposed methodology's robustness by conducting case studies. Al-Saeed et al. (2020) suggested future research to validate their work by analyzing feedback from BDO users and nonconformance reports. Shahinmoghadam et al. (2021) suggest validating the consistency of the proposed system by involving more people with different backgrounds and individual

 characteristics. Alizadehsalehi and Yitmen (2021) suggested future research to validate their framework by implementing it on multiple construction projects using objective data to evaluate the long-term impact of DRX in construction operations. Also, Villa et al. (2021) recommended future research to utilize the data acquired from the proposed system for predictive maintenance management of building facilities.

Several studies recommended new approaches that should be developed by future scholars. For example, Zhu and Wu (2021a) suggested that scholars should develop a proper georeferencing approach for the infrastructure domain. In addition, Desogus et al. (2021) proposed creating a 3D visualization of the parameters to quickly identify problematic areas of a building by highlighting using color schemes of the building areas where comfort conditions are not met or exceeded the time limit, as well as any areas where the sensor detects a misuse or excess of energy usage. Schimanski et al. (2019) suggested integrating lean management approaches with BIM at the data-processing level to create new integrated information systems.

In addition, some studies highlighted new topics and areas related to their work that is worth investigating. O'grady et al. (2021) suggested future research to look into how to link live energy data with building energy management systems and display it in the model so that high-consumption appliances can be identified and targeted reduction schemes can be implemented. Lee and Lee (2021) also suggested several research ideas for future scholars, such as creating a DT of offsite as well as onsite module manufacturing processes, obtaining various IoT sensor data, and investigating how risks in modular construction can be shared among stakeholders. Besides, Kaewunruen et al. (2021) suggested future research to investigate on automation of data analysis using Dynamo Script and the development of DTs for infrastructure maintenance and monitoring.

7. Conclusions

There has been growing research related to DT and BIM in the construction industry. Understanding the relationship between DT and BIM may benefit construction projects. However, most industry practitioners lack an understanding of the relationship between DT and BIM. Lack of information on the relationship and differences between DT and BIM leads to these issues. Therefore, this systematic review focused on synthesizing the findings of all relevant research related to DT and BIM in construction projects, thereby making it available and accessible to industry practitioners and researchers.

This study presents a systematic review of published articles on DT and BIM in construction projects. This study examines research articles published in order to give industry practitioners and researchers a comprehensive overview of the related topic. A total of 54 journal articles were carefully chosen and thoroughly reviewed. The articles were classified and analyzed based on the building construction life cycle: planning phase, design phase, construction phase, operation and maintenance phase, and decommissioning phase. Furthermore, several areas have emerged as requiring further investigation. This study is critical in ensuring that industry practitioners are capable of using DT and BIM correctly to ensure the success of their construction projects. In academia, the overview could be used to identify knowledge gaps before performing further research.

References

- Abanda, F. H., Mzyece, D., Oti, A. H., and Manjia, M. B. (2018), "A study of the potential of cloud/mobile BIM for the management of construction projects", *Applied System Innovation*, 1(2), 9.
- Abdelrahman, M. M., Chong, A., & Miller, C. (2022). Personal thermal comfort models using digital twins: Preference prediction with BIM-extracted spatial-temporal proximity data from Build2Vec. Building and Environment, 207, 108532.
- Abdul Nabi, M., & El-adaway, I. H. (2020). Modular construction: Determining decision-making factors and future research needs. Journal of Management in Engineering, 36(6), 04020085.
- Aish, R. (1986, July). Building modelling: the key to integrated construction CAD. In CIB 5th International Symposium on the Use of Computers for Environmental Engineering Related to Buildings (Vol. 5, pp. 7-9).
- Alizadehsalehi, S., & Yitmen, I. (2021). Digital twin-based progress monitoring management model through reality capture to extended reality technologies (DRX). Smart and Sustainable Built Environment.
- Al-Saeed, Y., Edwards, D. J., & Scaysbrook, S. (2020). Automating construction manufacturing procedures using BIM digital objects (BDOs): Case study of knowledge transfer partnership project in UK. Construction Innovation.

Antonino, M., Nicola, M., Claudio, D. M., Luciano, B., & Fulvio, R. C. (2019). Office building occupancy monitoring through image recognition sensors. International Journal of Safety and Security Engineering, 9(4), 371-380.

Azhar, S., Khalfan, M., & Magsood, T. (2012). Building information modeling (BIM): now and beyond. Australasian Journal of Construction Economics and Building, The, 12(4), 15-28.

- Badenko, V. L., Bolshakov, N. S., Tishchenko, E. B., Fedotov, A. A., Celani, A. C., & Yadykin, V. K. (2021). Integration of digital twin and BIM technologies within factories of the future. Magazine of Civil Engineering, (1 (101)), 10114.
- Bilal, M., L. O. Oyedele, J. Qadir, K. Munir, S. O. Ajayi, O. O. Akinade, H. A. Owolabi, H. A. Alaka, and M. Pasha, 2016b. "Big data in the construction industry: A review of present status, opportunities, and future trends." Adv. Eng. Inf. 30 (3): 500-521.
- Bond-Barnard, T.J., Steyn, H. and Fabris-Rotelli, I. (2013), "The impact of a call centre on communication in a programme and its projects." International Journal of Project Management, Vol. 31 No. 7, pp. 1006–1016.
- Chen, C., Zhao, Z., Xiao, J., & Tiong, R. (2021). A Conceptual Framework for Estimating Building Embodied Carbon Based on Digital Twin Technology and Life Cycle Assessment. Sustainability, 13(24), 13875.
- Christensen, K., Melfi, R., Nordman, B., Rosenblum, B., & Viera, R. (2014). Using existing network infrastructure to estimate building occupancy and control plugged-in devices in user workspaces. International Journal of Communication Networks and Distributed Systems, 12(1), 4-29.
- Coraglia, U. M., Simeone, D., Cursi, S., Fioravanti, A., Wurzer, G., & D'Alessandro, D. (2017). A simulation model for logical and operative clash detection.
- Demianenko, M., & De Gaetani, C. I. (2021). A procedure for automating energy analyses in the BIM context exploiting artificial neural networks and transfer learning technique. Energies, 14(10), 2956.
- . in Deng, Y., Cheng, J. C., & Anumba, C. (2016). Mapping between BIM and 3D GIS in different levels of detail using schema mediation and instance comparison. Automation in Construction, 67, 1-21.

- Desogus, G., Quaquero, E., Rubiu, G., Gatto, G., & Perra, C. (2021). Bim and iot sensors integration: A framework for consumption and indoor conditions data monitoring of existing buildings. Sustainability, 13(8), 4496.
- Diakite, A. A., & Zlatanova, S. (2020). Automatic geo-referencing of BIM in GIS environments using building footprints. Computers, Environment and Urban Systems, 80, 101453.
- Eastman, C. M., Eastman, C., Teicholz, P., Sacks, R., & Liston, K. (2011). BIM handbook: A guide to building information modeling for owners, managers, designers, engineers and contractors. John Wiley & Sons.
- National BIM Standard, United States, (n.d.). Frequently Asked Questions About the National BIM Standard-United States, http://www.nationalbimstandard. org/faq.php#faq1 (accessed January 24, 2022).
- Glaessgen, E., & Stargel, D. (2012, April). The digital twin paradigm for future NASA and US Air Force vehicles. In 53rd AIAA/ASME/ASCE/AHS/ASC structures, structural dynamics and materials conference 20th AIAA/ASME/AHS adaptive structures conference 14th AIAA (p. 1818).
- Götz, C. S., Karlsson, P., & Yitmen, I. (2020). Exploring applicability, interoperability and integrability of Blockchain-based digital twins for asset life cycle management. Smart and Sustainable Built Environment.
- Grieves, M. (2011). Virtually perfect: driving innovative and lean products through product lifecycle management. Space Coast Press.
- Gunduz, M., Nielsen, Y., & Özdemir, M. (2013). Quantification of delay factors using the relative importance index method for construction projects in Turkey. Journal of management in engineering, 29(2), 133-139.
- Gurevich, U., & Sacks, R. (2020). Longitudinal study of BIM adoption by public construction clients. Journal of Management in Engineering, 36(4), 05020008.
- He, R., Li, M., Gan, V. J., & Ma, J. (2021). BIM-enabled computerized design and digital fabrication of industrialized buildings: A case study. Journal of Cleaner Production, 278, 123505.
- Huynh, D., & Nguyen-Ky, S. (2020). Engaging Building Automation Data Visualisation Using Building Information Modelling and Progressive Web Application. Open Engineering, 10(1), 434-442.

- Jouan, P., & Hallot, P. (2020). Digital twin: Research framework to support preventive conservation policies. ISPRS International Journal of Geo-Information, 9(4), 228.
- Kaewunruen, S., & Lian, Q. (2019). Digital twin aided sustainability-based lifecycle management for railway turnout systems. Journal of Cleaner Production, 228, 1537-1551.
- Kaewunruen, S., & Xu, N. (2018). Digital twin for sustainability evaluation of railway station buildings. Frontiers in Built Environment, 77.
- Kaewunruen, S., Peng, S., & Phil-Ebosie, O. (2020). Digital twin aided sustainability and vulnerability audit for subway stations. Sustainability, 12(19), 7873.
- Kaewunruen, S., Rungskunroch, P., & Welsh, J. (2018). A digital-twin evaluation of net zero energy building for existing buildings. Sustainability, 11(1), 159.
- Kaewunruen, S., Sresakoolchai, J., Ma, W., & Phil-Ebosie, O. (2021). Digital twin aided vulnerability assessment and risk-based maintenance planning of bridge infrastructures exposed to extreme conditions. Sustainability, 13(4), 2051.
- Khajavi, S. H., Motlagh, N. H., Jaribion, A., Werner, L. C., & Holmström, J. (2019). Digital twin: vision, benefits, boundaries, and creation for buildings. IEEE access, 7, 147406-147419.
- Khan, M., Khan, N., Skibniewski, M. J., & Park, C. (2021). Environmental Particulate Matter (PM) Exposure Assessment of Construction Activities Using Low-Cost PM Sensor and Latin Hypercubic Technique. Sustainability, 13(14), 7797.
- Lee, D., & Lee, S. (2021). Digital twin for supply chain coordination in modular construction. Applied Sciences, 11(13), 5909.
- Lee, D., Lee, S. H., Masoud, N., Krishnan, M. S., & Li, V. C. (2021). Integrated digital twin and blockchain framework to support accountable information sharing in construction projects. Automation in construction, 127, 103688.
- Li, J., Li, N., Afsari, K., Peng, J., Wu, Z., & Cui, H. (2019). Integration of Building Information Modeling and Web Service Application Programming Interface for assessing building surroundings in early design stages. Building and Environment, 153, 91-100.
- Lin, Y. C., & Cheung, W. F. (2020). Developing WSN/BIM-based environmental monitoring management system for parking garages in smart cities. Journal of Management in Engineering, 36(3), 04020012.
- Liu, Z., Meng, X., Xing, Z., & Jiang, A. (2021). Digital Twin-Based Safety Risk Coupling of Prefabricated Building Hoisting. Sensors, 21(11), 3583.

- Liu, Z., Zhang, A., & Wang, W. (2020). A framework for an indoor safety management system based on digital twin. Sensors, 20(20), 5771.
- Lu, Q., Chen, L., Li, S., & Pitt, M. (2020). Semi-automatic geometric digital twinning for existing buildings based on images and CAD drawings. Automation in Construction, 115, 103183.
- Luka, A., & Guo, Y. (2021). PlantingSMART: The Parametric Approach for Trees in BIM with Full Lifecycle Application. Journal of Digital Landscape Architecture, 370-380.
- Morakinyo, O. M., Adebowale, A. S., Mokgobu, M. I., & Mukhola, M. S. (2017). Health risk of inhalation exposure to sub-10 µm particulate matter and gaseous pollutants in an urbanindustrial area in South Africa: An ecological study. BMJ open, 7(3), e013941.
- Moretti, N., Ellul, C., Cecconi, F. R., Papapesios, N., & Dejaco, M. C. (2021). GeoBIM for built environment condition assessment supporting asset management decision making. Automation in Construction, 130, 103859.
- Moretti, N., Xie, X., Merino, J., Brazauskas, J., & Parlikad, A. K. (2020). An openbim approach to iot integration with incomplete as-built data. Applied Sciences, 10(22), 8287.
- Moyano, J., Gil-Arizón, I., Nieto-Julián, J. E., & Marín-García, D. (2022). Analysis and management of structural deformations through parametric models and HBIM workflow in architectural heritage. Journal of Building Engineering, 45, 103274.
- Nasaruddin, A. N., Ito, T., & Tuan, T. B. (2018). Digital twin approach to building information management. In The Proceedings of Manufacturing Systems Division Conference 2018 (p. 304). The Japan Society of Mechanical Engineers.
- Ninić, J., Koch, C., & Stascheit, J. (2017). An integrated platform for design and numerical analysis of shield tunnelling processes on different levels of detail. Advances in Engineering Software, 112, 165-179.
- O'Grady, T. M., Brajkovich, N., Minunno, R., Chong, H. Y., & Morrison, G. M. (2021). Circular Economy and Virtual Reality in Advanced BIM-Based Prefabricated Construction. Energies, 14(13), 4065.
- Olawumi, T. O., and D. W. Chan. 2018. "A scientometric review of global research on sustainability and sustainable development." J. Cleaner Prod. 183 (May): 231–250. https://doi.org/10.1016/j.jclepro.2018.02 .162.
- Oliveira, P. P. (2020). Digital twin development for airport management. Journal of Airport Management, 14(3), 246-259.

Oti, A. H., Farrell, P., Abanda, F. H., McMahon, P., Mahamadu, A. M., Mzyece, D., ... & Prinja,
 N. (2021). A BIM-driven framework for integrating rules and regulations in the decommissioning of nuclear power plants. Construction Innovation.

- Pan, Y., & Zhang, L. (2021). A BIM-data mining integrated digital twin framework for advanced project management. Automation in Construction, 124, 103564.
- Pan, Z., Shi, J., & Jiang, L. (2020). A Novel HDF-Based Data Compression and Integration Approach to Support BIM-GIS Practical Applications. Advances in Civil Engineering, 2020.
- Qi, Q., & Tao, F. (2018a). Digital twin and big data towards smart manufacturing and industry 4.0: 360-degree comparison. Ieee Access, 6, 3585-3593.
- Qi, Q., Tao, F., Zuo, Y., & Zhao, D. (2018b). Digital twin service towards smart manufacturing. Procedia Cirp, 72, 237-242.
- Rausch, C., & Haas, C. (2021). Automated shape and pose updating of building information model elements from 3D point clouds. Automation in Construction, 124, 103561.
- Rausch, C., Lu, R., Talebi, S., & Haas, C. (2021). Deploying 3D scanning based geometric digital twins during fabrication and assembly in offsite manufacturing. International Journal of Construction Management, 1-14.
- Sacks, R., Brilakis, I., Pikas, E., Xie, H. S., & Girolami, M. (2020). Construction with digital twin information systems. Data-Centric Engineering, 1.
- Sacks, R., Eastman, C., Lee, G., & Teicholz, P. (2018). BIM handbook: A guide to building information modeling for owners, designers, engineers, contractors, and facility managers. John Wiley & Sons.
- Sacks, R., Koskela, L., Dave, B. A., & Owen, R. (2010). Interaction of lean and building information modeling in construction. Journal of construction engineering and management, 136(9), 968-980.
- Schimanski, C. P., Pasetti Monizza, G., Marcher, C., & Matt, D. T. (2019). Pushing digital automation of configure-to-order services in small and medium enterprises of the construction equipment industry: A design science research approach. Applied Sciences, 9(18), 3780.

- Seghezzi, E., Locatelli, M., Pellegrini, L., Pattini, G., Di Giuda, G. M., Tagliabue, L. C., & Boella,
 G. (2021). Towards an occupancy-oriented digital twin for facility management: test
 campaign and sensors assessment. Applied Sciences, 11(7), 3108.
- Sepasgozar, S. M. (2020). Digital twin and web-based virtual gaming technologies for online education: A case of construction management and engineering. Applied Sciences, 10(13), 4678.
- Shahinmoghadam, M., Natephra, W., & Motamedi, A. (2021). BIM-and IoT-based virtual reality tool for real-time thermal comfort assessment in building enclosures. Building and Environment, 199, 107905.
- Succar, B. (2009). Building information modelling framework: A research and delivery foundation for industry stakeholders. Automation in construction, 18(3), 357-375.
- Tang, P., Huber, D., Akinci, B., Lipman, R., & Lytle, A. (2010). Automatic reconstruction of asbuilt building information models from laser-scanned point clouds: A review of related techniques. Automation in construction, 19(7), 829-843.
- Tao, F., Cheng, J., Qi, Q., Zhang, M., Zhang, H., & Sui, F. (2018). Digital twin-driven product design, manufacturing and service with big data. The International Journal of Advanced Manufacturing Technology, 94(9), 3563-3576.
- Teisserenc, B., & Sepasgozar, S. (2021). Adoption of Blockchain Technology through Digital Twins in the Construction Industry 4.0: A PESTELS Approach. Buildings, 11(12), 670.

Torrecilla-garcía, J. A., Pardo-ferreira, M. C., & Rubio-romero, J. C. Overall introduction to the framework of Bim-based digital twinning in decision-making in safety management in building construction industry.

- Villa, V., Naticchia, B., Bruno, G., Aliev, K., Piantanida, P., & Antonelli, D. (2021). IoT Open-Source Architecture for the Maintenance of Building Facilities. Applied Sciences, 11(12), 5374.
- Volk, R., Stengel, J., & Schultmann, F. (2014). Building Information Modeling (BIM) for existing buildings—Literature review and future needs. Automation in construction, 38, 109-127.
- White, G., Zink, A., Codecá, L., & Clarke, S. (2021). A digital twin smart city for citizen feedback. Cities, 110, 103064.

- Xie, X., Lu, Q., Rodenas-Herraiz, D., Parlikad, A. K., & Schooling, J. M. (2020). Visualised inspection system for monitoring environmental anomalies during daily operation and maintenance. Engineering, Construction and Architectural Management.
- Xu, Y., Sun, Y., Liu, X., & Zheng, Y. (2019). A digital-twin-assisted fault diagnosis using deep transfer learning. IEEE Access, 7, 19990-19999.
- Youn, H. C., Yoon, J. S., & Ryoo, S. L. (2021). HBIM for the Characteristics of Korean Traditional Wooden Architecture: Bracket Set Modelling Based on 3D Scanning. Buildings, 11(11), 506.
- Yu, G., Zhang, S., Hu, M., & Wang, Y. K. (2020). Prediction of highway tunnel pavement performance based on digital twin and multiple time series stacking. Advances in Civil Engineering, 2020.
- Zaballos, A., Briones, A., Massa, A., Centelles, P., & Caballero, V. (2020). A smart campus' digital twin for sustainable comfort monitoring. Sustainability, 12(21), 9196.
- Zhang, J., Cheng, J. C., Chen, W., & Chen, K. (2022). Digital Twins for Construction Sites: Concepts, LoD Definition, and Applications. Journal of Management in Engineering, 38(2), 04021094.
- Zhao, L., Zhang, H., Wang, Q., & Wang, H. (2021). Digital-Twin-Based evaluation of nearly zero-energy building for existing buildings based on scan-to-bim. Advances in Civil Engineering, 2021.
- Zhu, J., & Wu, P. (2021a). A common approach to geo-referencing building models in industry foundation classes for bim/gis integration. ISPRS International Journal of Geo-Information, 10(6), 362.
- Zhu, J., & Wu, P. (2021b). Towards effective BIM/GIS data integration for smart city by integrating computer graphics technique. Remote Sensing, 13(10), 1889.
- Zomorodian, Z. S., Tahsildoost, M., & Hafezi, M. (2016). Thermal comfort in educational buildings: A review article. Renewable and sustainable energy reviews, 59, 895-906.

| Aspect | DT | BIM |
|---------------------|--|--|
| Definition | A connected and synchronized digital | A digital representation of |
| | representation of assets, processes, | built in a construction proje |
| | systems to understand and predict | |
| | potential issues across its life cycle | |
| Simulation | Real-time operational response | No real-time synchronization |
| of | | |
| operations | | |
| Concept | Interaction of people with built | Visualization in the design |
| | environments | construction phase |
| Origin | NASA's Apollo program | Charles Eastman |
| Values | Predictive maintenance; scenario and | Cost reduction; Increase p |
| | risk assessment; informed decision | stakeholders' interoperabili |
| | support system; occupants' comfort | - |
| | assessment | |
| Phase of | Operations phase, maintenance phase | Planning phase, desig |
| life cvcle | | construction phase, decon |
| · | | phase |
| Users | Architects, facility managers | Architects, engineers, deve |
| | | facility managers |
| life cycle Users | Architects, facility managers | construction phase, construction phase phase Architects, engineers, facility managers |







Table 2. Summary of selected articles used for this study

| Journals | No. of | Articles |
|-----------------------------|----------|---|
| | articles | |
| Sustainability | 7 | Chen et al. (2021); Kaewunruen et al. (2018); |
| | | Zaballos et al. 2020; Desogus et al. (2021); |
| | | Kaewunruen et al. (2020); Kaewunruen et al. |
| | | (2021); Khan et al. (2021) |
| Applied Sciences | 6 | Moretti et al. (2020); Lee and Lee (2021); |
| | | Porsani et al. (2021); Villa et al. (2021); |
| | | Schimanski et al. (2019); Seghezzi et al. (2021) |
| Automation in Construction | 5 | Pan and Zhang (2021); Rausch and Haas (2021); |
| | | Moretti et al. (2021); Lee et al. (2021); Lu et al. |
| | | (2020) |
| Journal of Management in | 3 | Lin and Cheung (2020); Zhang et al. (2022); |
| Engineering | | Gurevich and Sacks (2020) |
| Advances in Civil | 3 | Pan et al. (2020); Zhao et al. (2021); Yu et al. |
| Engineering | | (2020) |
| Journal of Cleaner | 2 | He et al. (2021); Kaewunruen and Lian (2019) |
| Production | | |
| Building and Environment | 2 | Shahinmoghadam et al. (2021); Abdelrahman et |
| | | al. (2022) |
| Energies | 2 | Demianenko and Gaetani (2021); O'Grady et al. |
| | | (2021) |
| Construction Innovation | 2 | Oti et al. (2021); Al-Saeed et al. (2020) |
| Buildings | 2 | Teisserenc and Sepasgozar (2021); Youn et al. |
| | | (2021) |
| ISPRS International Journal | 2 | Zhu and Wu (2021a); Jouan and Hallot (2020) |
| of Geo-Information | | |
| Smart and Sustainable Built | 2 | Alizadehsalehi and Yitmen (2021); Götz et al. |
| Environment | | (2020) |

| Sensors | 2 | Liu et al. (2020); Liu et al. (2021) |
|---------------------------|----|--------------------------------------|
| Cities | 1 | White et al. (2021) |
| Computers, Environment | 1 | Diakite and Zlatanova (2020) |
| and Urban Systems | | |
| Data-Centric Engineering | 1 | Sacks et al. (2020) |
| Direccion y Organizacion | 1 | Torrecilla-García et al. (2021) |
| Engineering, Construction | 1 | Xie et al. (2020) |
| and Architectural | | |
| Management | | |
| Frontiers in Built | 1 | Kaewunruen and Xu (2018) |
| Environment | | |
| International Journal of | 1 | Rausch et al. (2021) |
| Construction Management | | |
| International Journal of | 1 | Antonino et al. (2019) |
| Safety and Security | | |
| Engineering | | |
| Journal of Airport | 1 | Oliveira (2020) |
| Management | | |
| Journal of Building | 1 | Moyano et al. (2022) |
| Engineering | | |
| Magazine of Civil | 1 | Badenko et al. (2021) |
| Engineering | | |
| Open Engineering | 1 | Huynh and Nguyen-Ky (2020) |
| Remote Sensing | 1 | Zhu and Wu (2021b) |
| Journal of Digital | 1 | Luka and Guo (2021) |
| Landscape Architecture | | |
| Total | 54 | |
| | | -1- |
| | | |
| | | |
| | | |
| | | |







Figure 4. Themes of the selected articles with number of publications



Figure 5. Framework to link existing research areas to future directions