



Digital twin-based decision support systems for natural disaster management: A systematic review of current trends and approaches

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ABSTRACT

Increased urbanization and extreme climate events in recent years have led to a rise in the frequency and severity of widespread natural disasters. The disaster management cycle is a common framework that helps emergency management organizations develop procedures that can minimize the devastating impacts of natural disasters. Recently, researchers have begun to explore how big data and artificial intelligence can be used to develop virtual digital twin (DT) models of disaster situations that provide real-time decision support for each phase of the disaster management cycle. This study presents a systematic literature review of the burgeoning research area of DT-based decision support systems for disaster management. We identify the various locations and disaster types featured in DT case studies, the data collection techniques and computational methods utilized to create virtual representations of disaster-affected areas, and the decision-making tasks that DTs have been applied to. Based on our findings, we highlight several research gaps in the current literature and provide a set of recommendations that can serve as guidelines for future studies. Overall, this review provides researchers and practitioners with insights into the current trends and future research directions for DT-based decision support systems for natural disaster management.

Video to this article can be found online at <https://doi.org/10.1016/j.sctalk.2024.100406>.

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Figures and tables



Fig. 1. The four phases of the disaster management cycle adapted from Song et al. [1]

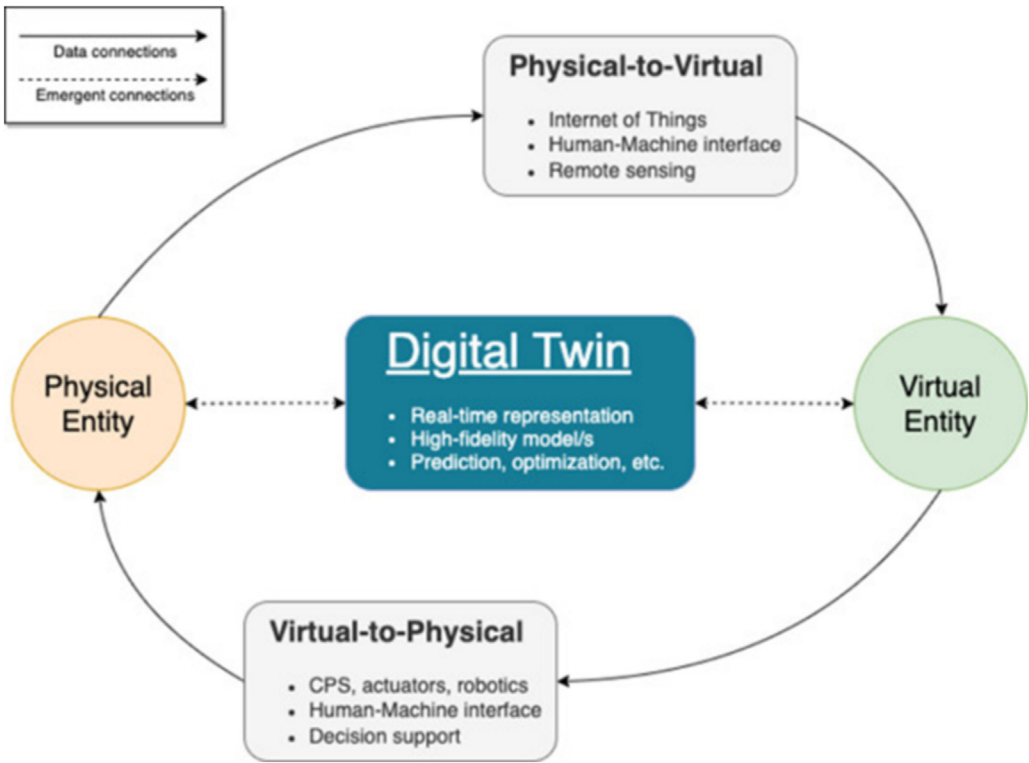


Fig. 2. A conceptual model of a digital twin. This figure is adapted from Purcell and Neubauer [2].

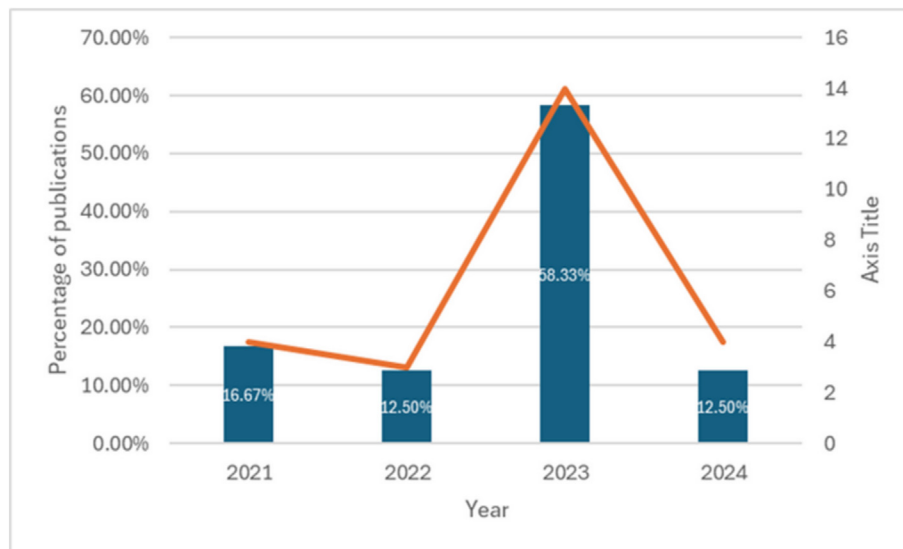


Fig. 3. The temporal distribution of the reviewed publications on DT-based DSS for disaster management.



Fig. 4. A keyword cloud illustrating the keywords that appeared most frequently in the reviewed publications.

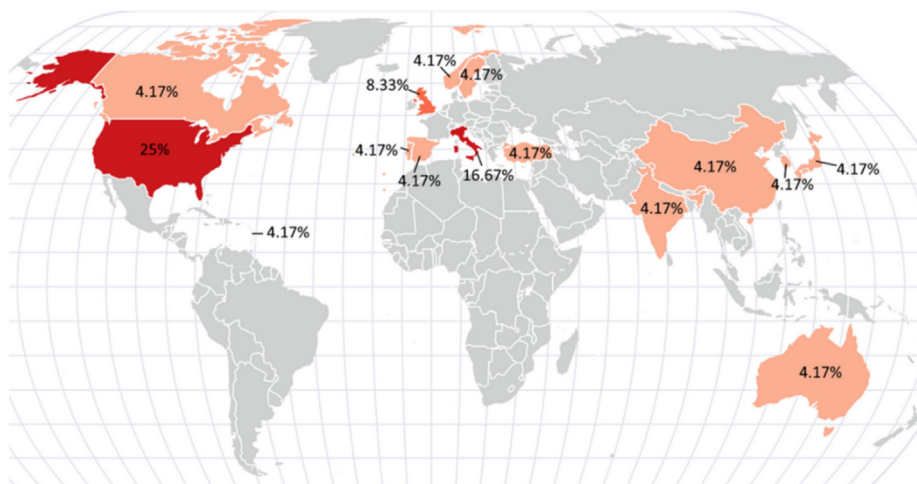


Fig. 5. The worldwide distribution of countries featured in the reviewed DT-based DSS for disaster management case studies.

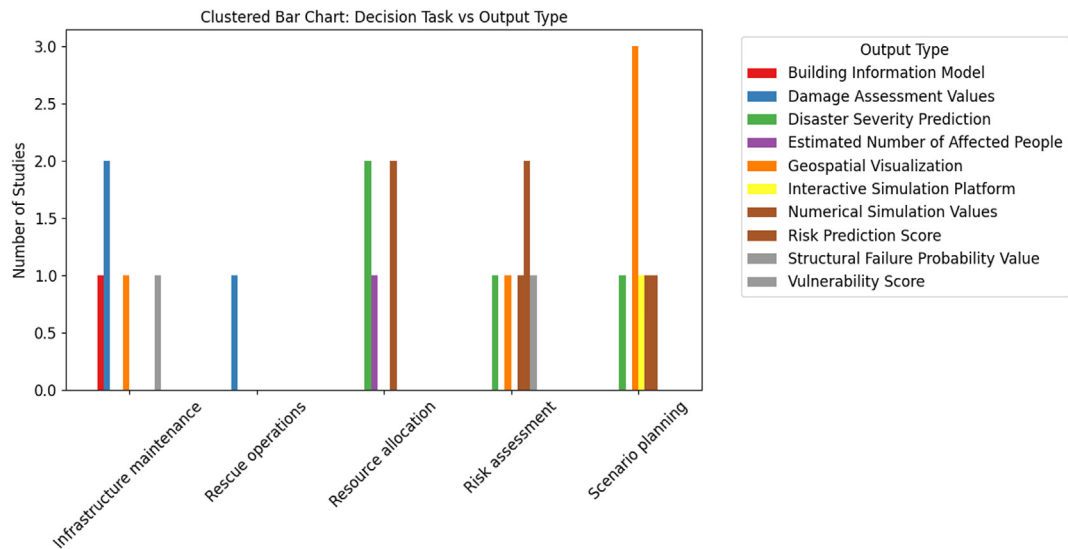


Fig. 6. A comparison between the outputs produced by the DTs in the reviewed publications and the decision tasks they are associated with.

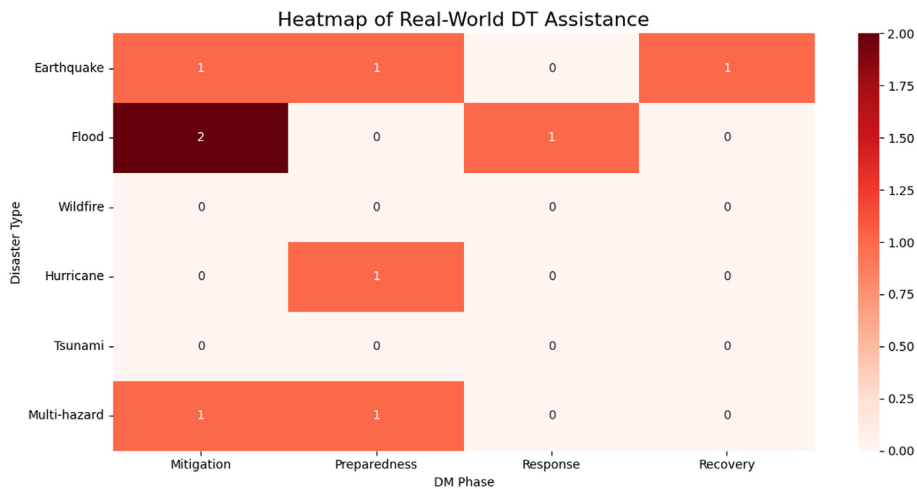


Fig. 7. The number of DTs that have provided real-world DM assistance for each disaster type and DM phase.

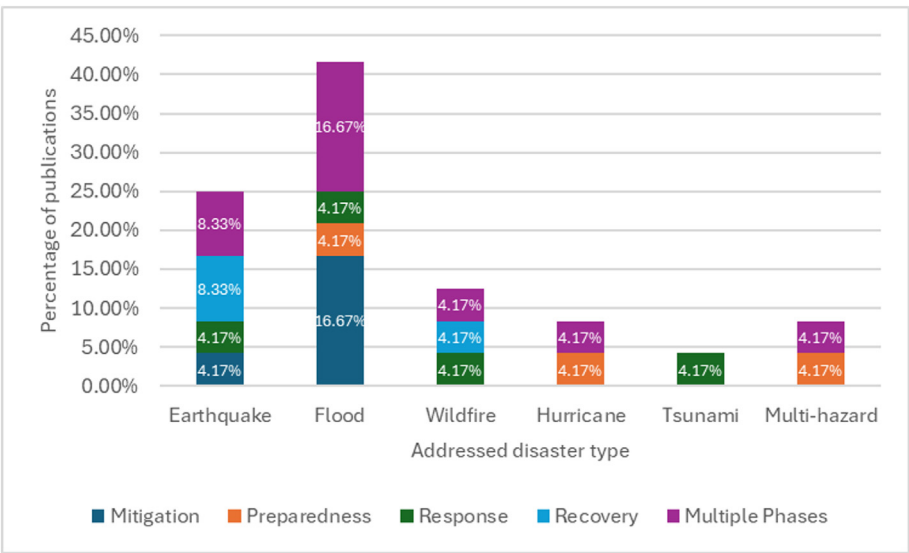


Fig. 8. The disaster types studied in the reviewed DT-based DSS publications and the DM phases being addressed.

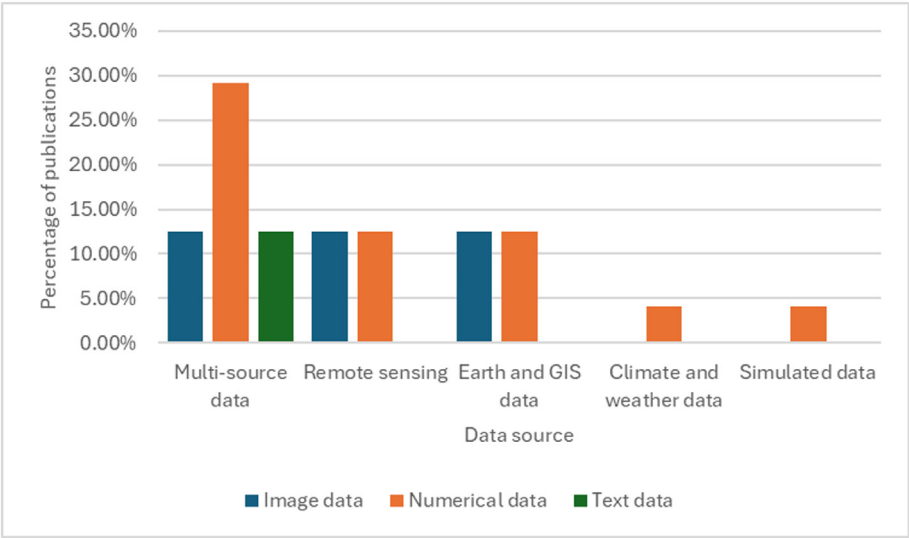


Fig. 9. The data sources and data types used to develop DT-based DSS for disaster management in the reviewed publications.

Table 1
Summary of research questions, findings and identified research gaps based on the reviewed publications.

Research Question	Findings	Research Gap
RQ 1 - What are the most common disaster types that have been studied in the DT-based DSS for DM literature?	Earthquakes, floods, and wildfires are the most commonly studied disasters.	There is a lack of DT cases studies on disasters in non-urban locations and no studies conducted in Africa or South America.
RQ 2 - What data sources and data types have been used to develop DT-based DSS for DM?	Most DTs for DM use multi-source heterogeneous data for DT development.	Expert knowledge is rarely used as a data source during DT development.
RQ 3 - What computational methods have been used to create virtual models of disaster situations in DT-based DSS for DM?	Many DT implementations use a combination of process-based models, 3D modelling and ML.	There are very few computational methods that can be used to develop virtual DT models for disaster situations with limited data availability.
RQ 4 - How have DTs been used to facilitate decision making in each phase of DM?	DTs primarily provide decision support for multiple phases of DM through scenario planning and disaster risk assessment.	There is a lack of DT-based DSS that facilitate interorganizational collaborative decision making for DM.

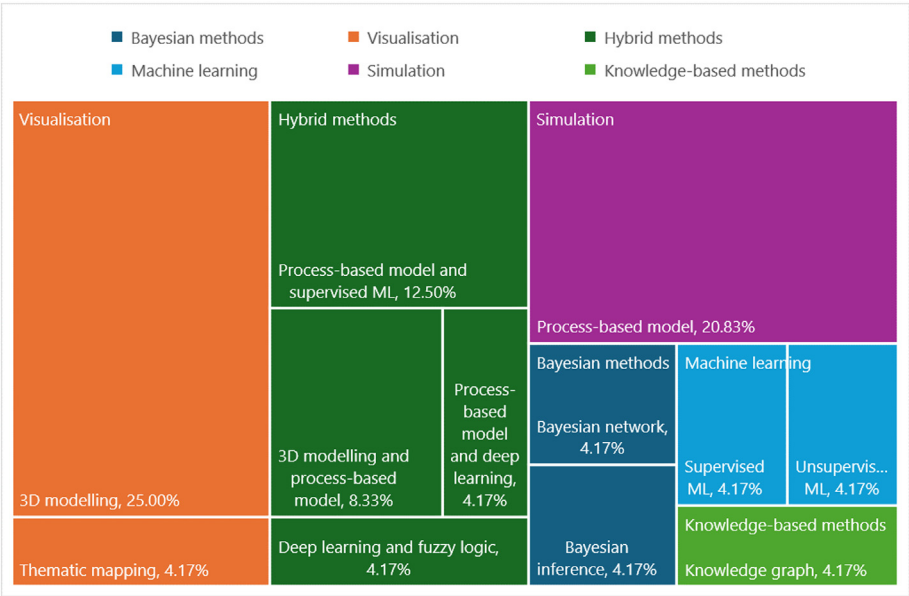


Fig. 10. The six categories of techniques mentioned in the reviewed DT-based DSS for disaster management publications.

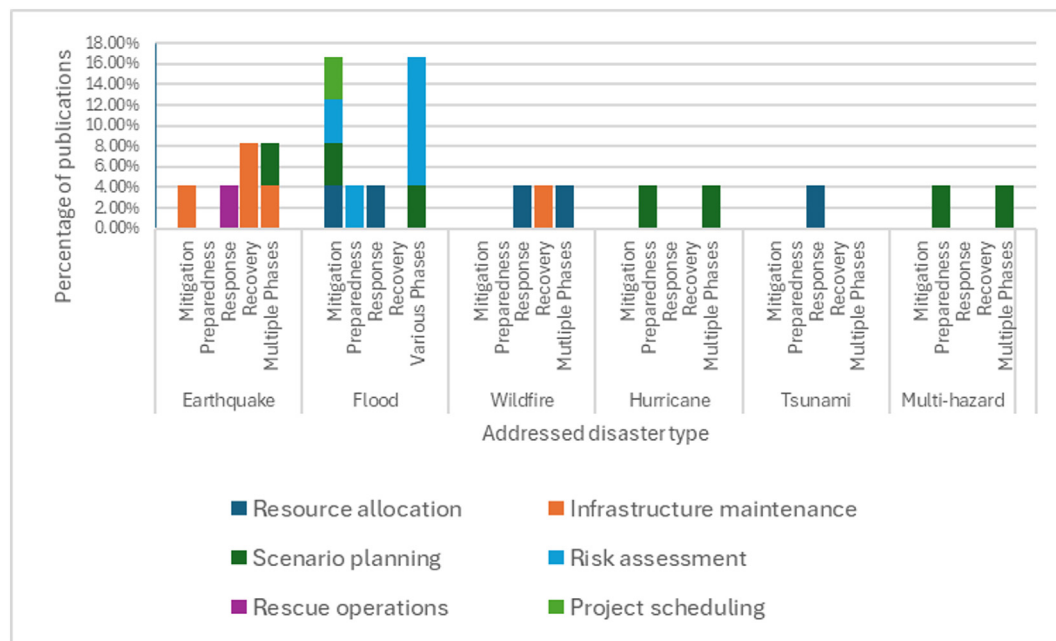


Fig. 11. The decision-making applications mentioned in the reviewed DT-based DSS for disaster management publications and the DM phases being addressed.

CRedit authorship contribution statement

Solomon Inyang: Writing – original draft, Visualization, Project administration, Methodology, Investigation, Formal analysis, Data curation, Conceptualization. **Firouzeh Rosa Taghikhah:** Writing – review & editing, Validation, Supervision.

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Declaration of interests

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

The authors declare the following financial interests/personal relationships which may be considered as potential competing interests:

Data availability

Data will be made available on request.

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Further readings

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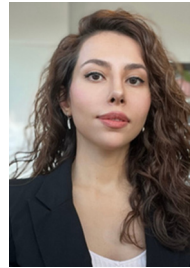
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