



Making (common) sense of Urban Digital Twins with Q methodology

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ABSTRACT

Urban Digital Twins (UDTs) serve as boundary objects, facilitating interactions among diverse actor-networks within an innovation ecosystem. The concept of UDTs exhibits 'interpretative flexibility', allowing policy-makers, technologists, urban planners and citizens to impose their values, needs and expectations onto the technology while sustaining a shared understanding of its potential. A key question arises: how can perspectives on UDTs within these actor-networks be identified and guide future innovation? Using the Q methodology for 'boundary spanning', the authors investigated the range of perspectives on UDTs and their influence on shaping regional innovation strategies. The research included some intervention-oriented aims and engaged 29 participants from governmental, industrial, and academic sectors involved in UDT initiatives in a regional urban network in the Netherlands. In interviews, participants completed a card-sorting task, ranking 41 statements that addressed five critical dimensions: Terminology, Values, Impact, Innovation and Strategy. The analysis revealed three dominant perspectives: (1) Strategic Confidence in UDTs; (2) Cautious Critique of UDTs; and (3) Technological Pragmatism for UDTs. The findings from this Q study fostered a better understanding of the UDT perspectives and cross-sector collaboration in the urban network, leading to more dynamic and adaptive UDT strategies.

1. Introduction

Initially developed for applications in manufacturing and aerospace, the Digital Twin (DT) concept has expanded over recent decades to encompass spatial development, where it supports data-driven decision-making (Batty, 2018; Dhar et al., 2022; Geertman & Witte, 2024; Tomko & Winter, 2019). In spatial development and urban planning, DTs typically function as 'Virtual Twins' (VTs), employing 3D computer graphics and increasingly incorporating Immersive Reality technologies (e.g., Virtual and Augmented Reality) (Dani & Supangkat, 2022; Ssin et al., 2021). Gametech companies, such as EPIC Unreal, are active on the (U) DT market (Naserentin et al., 2022; Rantanen et al., 2023). These advancements represent the ongoing evolution of digital infrastructure, propelled by technologies such as Data Science (DS), Artificial Intelligence (AI), Machine Learning (ML) and the Internet of Things (IoT). They converge within the broader 'smart cities' framework (Deren et al., 2021; Xia et al., 2022) and Industry 4.0 or 5.0 (Klingenberg et al., 2022; Liao et al., 2017).

The traditional engineering conceptualisation of DTs is characterised by a set of virtual information constructs that fully describe a potential

or actual physical manufactured product from the micro-atomic level to the macro-geometrical level (Barricelli et al., 2019; Grieves, 2016). However, DTs are increasingly promoted as tools for managing complex Multi-Actor Systems (MASs) (Enserink et al., 2022) and Socio-Ecological-Technological Systems (SETs) (Sharifi, 2023), such as cities, forests and oceans (Oti-Sarpong et al., 2022; Tagarakis et al., 2024; Tzachor et al., 2023). This broadening of scope has significant ramifications for DTs' societal and ethical implications and how they are conceptualized, engineered and utilised (Saltelli et al., 2024), primarily because the data and knowledge necessary for managing MAS and SET systems are often unavailable, unreliable or under debate; furthermore, stakeholder consensus on underlying values is low (Tekinerdogan & Verdouw, 2020). Like other advanced Planning Support Systems (PSSs), DTs operate at an intricate Science-Policy Interface (SPI), but how they do so is insufficiently understood (Korenhof et al., 2021; Mayer, 2022; Oti-Sarpong et al., 2022). Recent reports and academic studies aim to provide clarity by offering conceptual frameworks and theoretical models to better understand the role and potential of UDTs (Ortt & Tiihonen, 2022).

The development of UDTs lacks a clear, definitive roadmap.

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Innovation in this field is mainly evolutionary; there is a complex interplay of competition and collaboration among UDT platforms, each striving to demonstrate their value in pilot projects. Fragmented use cases contribute to uncertainty, confusion and undetermined social impact. Furthermore, the governance perspective underneath the development of UDT technologies – e.g., who controls it? – is not well-addressed (Lei et al., 2023). UDTs are a sociotechnical innovation, and this requires examining the interactions, including meaning-making, among actors in regional actor-networks around spatial development through digital innovations (Nochta et al., 2021). Reconstructing the discourse surrounding UDTs is crucial: Which actors in the innovation network hold what beliefs about UDTs? Which actors in the network have similar or divergent beliefs? What are the specific issues in and between these belief systems? Moreover, how does this influence the UDTs' future path? The leading research question, therefore, is: How can perspectives on UDTs within these actor-networks be identified and guide future innovation?

Drawing on the Social Construction of Technology (SCOT) framework, this study explores the stakeholder discourse surrounding UDTs, viewing them as 'boundary objects' that offer 'interpretative flexibility' across communities while maintaining a 'cohesive identity' to drive technological advancement (Oti-Sarpong et al., 2022; Pinch & Bijker, 1984). We used Q methodology, a distinctive mixed set of quantitative and qualitative methods, principles and procedures, to explore and frame the intersubjective viewpoints. We used case studies of UDTs, a systematic literature review based on keyword co-occurrence analysis and in-depth real-time online and offline interviews with the Q-methodology card sorting technique to systematically uncover the discourse surrounding UDTs. We also draw upon Actor–Network Theory (ANT), which describes dynamic associations between human and non-human actors (e.g., technologies, institutions, regulations) that co-shape innovation, planning and policy outcomes (Baron & Gomez, 2016). The Q-study and its results were also designed as action or intervention research to facilitate meaningful interactions among the actors in an urban network in a Dutch province and the UDT innovation system in that region. Therefore, this study's participants were purposefully selected from local and regional governments, DT companies, and research institutes in that network, and the Q study results were used to support their regional DT innovation strategy.

2. Theory and concepts

2.1. Perspectives on digital twins and urban development

Making sense of DTs by reviewing the enormous amount of information in academics, industry, consultancy and media is challenging and needs to be clarified. For example, a quick search for 'Digital Twin' on a search engine yields nearly half a million recent results. When 'urban' is added, the results remain comparable, reflecting the growing relevance and widespread interest in DTs for Urban Development. The number of academic publications discussing Urban Digital Twins (UDTs) has also increased dramatically in recent years. A Scopus search for the keyword 'Urban + Digital Twin' yielded over a thousand academic articles. Only a few were published in 2018, followed by a notable rise to around 100 in 2021, and nearly 400 academic articles published in 2024 were included in the search results. The majority of publications (>70 %) focus on the development of foundational and relevant technologies within the fields of computer science, engineering and mathematics. More recently, publications exploring the social-political aspects surrounding UDTs have been on the rise (Ketzler et al., 2020; Lei et al., 2023; Weil et al., 2023).

Despite the extensive body of literature aimed at defining UDTs, there remains little consensus regarding the composition and precise definition of the concept (Boyes & Watson, 2022; Singh et al., 2021; Van Der Horn & Mahadevan, 2021). Boyes and Watson (2022) offer one of the more widely referenced definitions, describing a DT as 'a live digital

coupling of the state of a physical asset or process to a virtual representation with a functional output' (Scott, 2020). The term 'live coupling' (e.g., through real-time data feeds) is problematic and contested in the context of UDTs, as it is often difficult to achieve for MAS, SET systems and s.a. cities, and, for many applications – such as long-term scenario planning – it is unnecessary.

Furthermore, there are many classifications of 'types' of (U)DTs based on what they can do or how they are built (Ortt & Tiihonen, 2022). Tekinerdogan and Verdouw (2020), for example, classify DTs into four types: 1) Digital models: there is only a manual translation or interpretation between the digital and physical objects; 2) Digital generators: a digital model is used to automatically generate or enhance a physical object; 3) Digital shadows: systems incorporating automated real-time data input with manual interpretation; 4) Autonomous digital twins: the digital object and physical object are causally connected and synchronised via autonomous dataflows. These and other classifications trigger critical debate regarding the extent to which a Digital Twin application can be considered a Digital Twin. Some experts argue that without nearly autonomous real-time synchronization between the Reference Twin (RT) and the Digital Twin (DT), a Digital Twin (DT) is not truly a Digital Twin.

As part of the preparation for designing the Q study, we examined a range of UDT applications in the Netherlands and assessed their alignment with established DT definitions and types (see also Ávila Eça de Matos et al., 2022). We identified and analysed 21 UDT use cases (sufficiently documented before 2024), with five UDT platforms emerging as more frequently utilised in the Netherlands (see Table 7 in Annex). While these platforms share commonalities, they exhibit distinctive features on dimensions such as visualisation, data integration, interconnection with models and simulations and user interaction. Our analysis revealed that 13 UDTs are like the digital models that focus on visualising buildings, roads, vegetation, and subsurface elements in 3D. Two UDTs are best classified as digital generators, addressing issues such as noise and pollution, while seven leverage real-time data, primarily for traffic and crowds, classifying them as digital shadows. Importantly, no fully autonomous UDTs, as defined above, were identified. The findings highlight the limitations of typologies and both the constraints and opportunities for future innovation. Are autonomous UDTs feasible, necessary, or even desirable in urban planning? Most actors in the investigated Urban Network argued that they are not. Still, some planners envisioned future UDTs of the autonomous type for crowd management, leveraging real-time monitoring of crowd movements, predictive risk analysis, and semi-automated crowd control measures, such as dynamically closing or opening specific passages. It illustrates how different perspectives on UDT may influence future innovation paths.

As noted, UDTs can focus on specific city subsystems, such as urban mobility, crowds, water, pollution or neighbourhood development. They may try to integrate many or all of these dimensions into one DT platform. UDTs can serve various forms of decision-making, including real-time monitoring, design and planning, optimisation, maintenance and remote access (Sharma et al., 2022; Singh et al., 2021). However, they are also increasingly advocated to address social dimensions of spatial development, such as citizen participation, stakeholder engagement and long-term scenario planning. In addition, they are used as instruments in legislation, environmental impact assessments and permitting. This reflects the flexibility and evolving nature of UDT applications as socio-technical systems in real-world urban environments (Nochta et al., 2021).

Van der Horn and Mahadevan highlight the ambiguity surrounding DTs, noting that this lack of clarity undermines the concept and hampers its potential benefits. Jeddoub et al. (2023) state that the academic discourse struggles to define DTs precisely (Shahzad et al., 2022), often leading to terminological ambiguity (Ketzler et al., 2020), different forms and outputs (Ferré-Bigorra et al., 2022), domain-specific approaches (Lehtola et al., 2022) and various technical and non-technical

challenges that hinder its full deployment (Lei et al., 2023). Batty (2018) criticises the validity of the DT metaphor for cities, and Tomko and Winter (2019) propose replacing the UDT metaphor with something like a ‘cyber-physical-social system with coupled properties’.

These divergent interpretations among practitioners can result in conflicting expectations and miscommunications, for instance, between clients and developers (Agrawal et al., 2022; Jeddoub et al., 2023). Al-Sehrawy et al., 2023 argue that DT builders rarely disclose their worldviews or motivations, complicating evaluation and comparison of DTs. Based on a theoretical paradigm for grounding pluralistic DTs, they define four DT approaches: Tech-driven, Disruptive, Cognitive and Humanistic. These underlying worldviews and approaches produce different kinds of coexisting DTs.

To further analyse the existing discourse on UDTs, we conducted a literature review supported by keyword co-occurrence analysis. This literature review was not only intended to map the existing discourse but was also a crucial step in developing the Q study statements, ensuring a representative set of perspectives on UDTs (see below). We used the Scopus database with a keyword string [Urban + Digital Twin], searching between 2018 and 2024 (September), resulting in a dataset of 1,138 articles. The database extract, in RIS format, included abstracts and authors' keywords, which were imported into VOSviewer (www.vosviewer.com) to construct and visualise keyword networks. This approach helped map the interconnected concepts across UDT-related publications, as illustrated in Fig. 1. Only keywords with a minimum of 5 occurrences (88 keywords met the threshold) are included in the network visualisation.

The result shows that, derived from DTs, UDTs are close to the concepts of smart cities, urban planning and 3D-city models. They are

driven by technologies like machine learning, artificial intelligence and remote sensing for 3D modelling and architectural design, with sustainable development and decision-making in urban planning as goals. However, no single dominant topic or technology stands out and thoroughly explains the concept, signalling the complexity and multi-dimensional nature of UDT discussions (see Fig. 1).

Despite the significant societal and political implications of UDTs, discussions surrounding their development and deployment often focus on technical engineering aspects, such as architectures and interoperability. Helbing and Argota Sánchez-Vaquerizo (2022) highlight the limited attention paid to human rights and dignity issues. This oversight is evident in our keyword co-occurrence analyses, where terms such as ‘ethics’ and ‘safety’ are notably absent. Other authors, including Haraguchi et al. (2024), point to concerns regarding privacy and the lack of robust public regulation, both issues that accompany the opportunities offered by DTs. They argue that instead of striving to create a ‘perfect’ DT that exerts total control, the goal should be to employ computer simulation technologies to benefit all levels of society.

In short, UDTs are a new branch on a decade-old tree of PSSs, existing alongside earlier branches such as (Urban) System Dynamics (SD), agent-based-modelling (ABM) and geo-information systems (GISs) (Batty, 2021; Geertman & Witte, 2024). Therefore, a reflective and critical discussion on the role of UDTs in the Science and Policy Interface (SPI) is equally relevant but does not stand out as a topic of study and debate (Te Brömmelstroet et al., 2014). In contrast, technocratic approaches prioritise innovation and technological advancements, often placing efficiency and progress above societal-ethical considerations. It highlights the need for responsible governance and a balanced approach to UDT deployment.

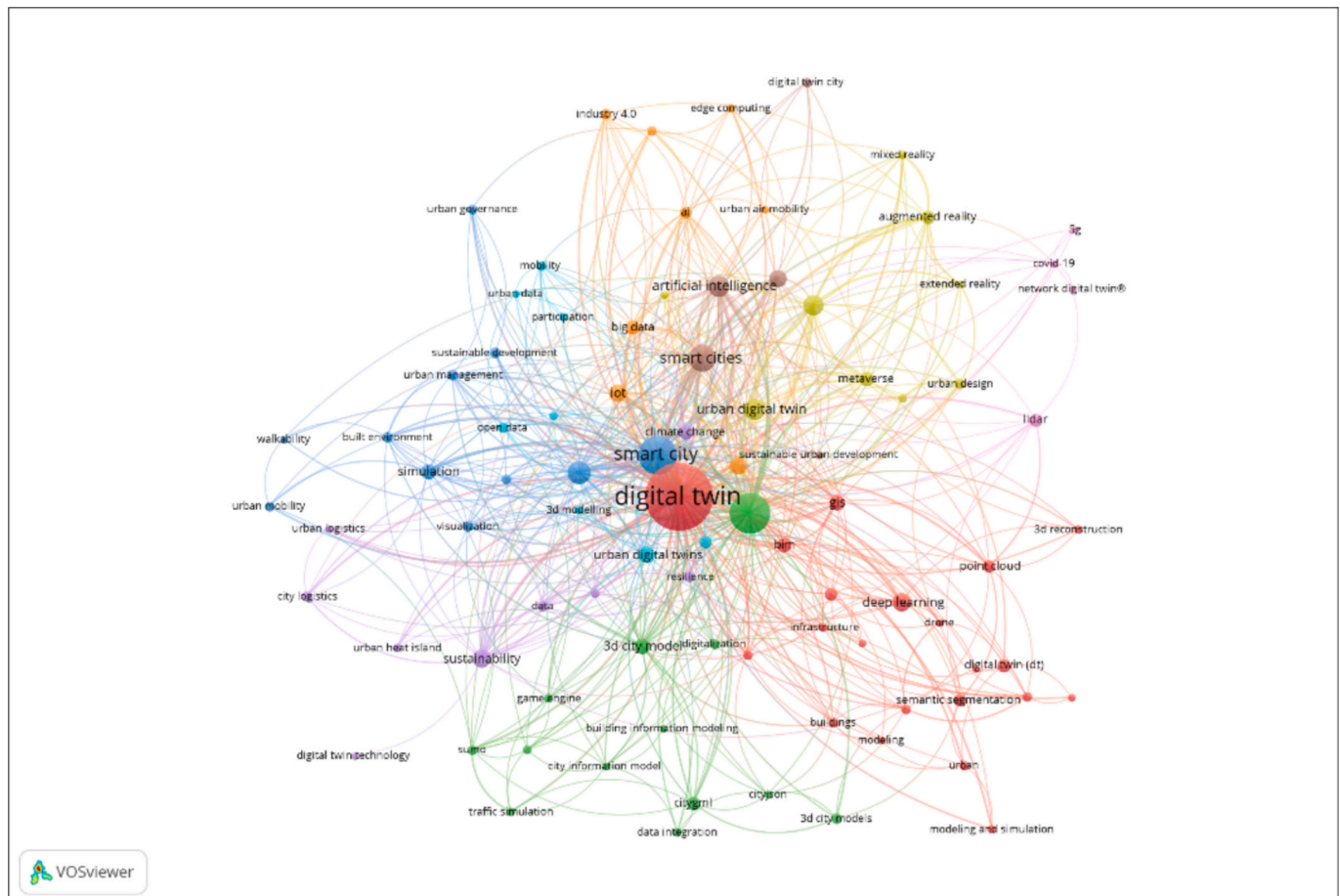


Fig. 1. Network visualisation of UDTs, (1138 Scopus articles, '18-'24, threshold 5).

These (and other) topics together constitute the discourse around UDT among actors – planners, academics, businesses, politicians etc. – in an innovation network. How can this discourse be investigated to guide UDT innovation strategies?

2.2. The social construction of UDTs

The understanding of how UDT function as a multi-interpretable innovation concept in networks of innovation, as described above, is based on several loosely connected theoretical and conceptual frameworks about the management of innovation. The Social Construction of Technology (SCOT) (Klein & Kleinman, 2002; Pinch & Bijker, 1984, 2012) posits that technology can only be fully understood within its social context, with the subjective perspectives of social actors playing a central role. These perspectives are shaped by influential social factors, including economic conditions, regulatory frameworks and cultural norms. In SCOT theory, ‘interpretative flexibility’ refers to the idea that various social groups can understand and use a single technology, such as UDT, in different ways. It explains why multiple UDT platforms and applications coexist, fostering innovation along varied trajectories.

The theory of ‘Boundary Objects’ (BO) provides a more nuanced treatment of the interpretative flexibility concept, stating that particular objects or ideas can be interpreted in varying ways across communities (i.e., ‘plasticity’) while maintaining a sufficient ‘common identity’ (i.e., integrity) to foster interaction, establish common ground, resolve problems and conflicts and strive towards consensus (Benitez et al., 2023; Star & Griesemer, 1989). BO can be any kind of artifact, such as things, technologies, ideas, and processes. Concrete examples of BO are field notes, maps, geo-information systems, technical standards (e.g., Building Information Models (BIM) in Construction), and also innovation concepts, such as Serious Games, the Metaverse and Digital Twins. An important consideration behind the UDT Q-study, is how BO function in an innovation network, and if and how they can be used for intervention and change.

Within the SCOT-related Actor-Network Theory (ANT), social actors are seen as components of broader networks that encompass both human and non-human entities, including technological artifacts themselves. In this framework, technology is not merely a reflection of social forces but is actively shaped through interactions among various actors (Baron & Gomez, 2016). The theory suggests that innovation processes can be influenced by shaping interactions—for example, by creating new interactions among actors, but also by constructing shared ‘meanings’ among actors. In ANT terms, the success of BO hinges on their ability to stabilise networks of actors, aligning diverse interests without collapsing into a singular, rigid interpretation. If the ‘integrity’ of a BO falters, the network of actors that support it may become unstable, causing the BO to lose its appeal as an innovation concept and creating an opportunity for another idea to emerge. Whereas ambiguity of concepts is sometimes seen as a problem for innovation, SCOT, ANT and BO theories argue that innovation benefits from a certain level of interpretative flexibility and plasticity.

The idea of ‘Boundary Spanning’ plays a crucial role in facilitating interactions across different actor-networks (Benitez et al., 2023). It involves individuals or entities that bridge gaps between diverse communities, allowing for the translation and negotiation of meanings, resources, and goals. Boundary spanners, which can be persons, objects, or ideas, enable communication and collaboration by interpreting and adapting the boundary object’s meaning for different stakeholders, helping to stabilise the network of actors involved.

One of the key challenges in innovation networks is designing effective ‘boundary spanning,’ for example, through action and intervention research. Q methodology can support boundary-spanning (Langston et al., 2024) by examining how BO are interpreted differently across stakeholder groups. When actors in a network better understand why and how they have similar-different perspectives, this can enable change.

Unlike interviews, focus groups, or questionnaires, which focus on individual or aggregated opinions, Q methodology clusters a few prevailing perspectives in the actor-network. While participatory observation captures direct interactions, Q methodology systematically compares structured viewpoints across diverse actor-networks, revealing underlying interpretative differences. These perspectives, in turn, shape interactions within the broader UDT innovation network, which may influence the innovation strategies.

2.3. Q methodology as boundary spanning

Introduced by William Stephenson, Q methodology systematically analyses subjective viewpoints by ranking statements in a quasi-normal distribution (Stephenson, 1936). The method combines qualitative and quantitative elements with manual card-sorting exercises, followed by interviews and factor analysis to identify shared perspectives (Ramlo, 2016; Watts & Stenner, 2012). Consequently, Q methodology has garnered increased attention in fields ranging from psychology to political science, marketing research and all sociology studies related to understanding human behaviour. In the study of social constructivism of technology, for example, it has been applied to topics including geo-engineering (Cairns & Stirling, 2014), cybersecurity (Ramlo & Nicholas, 2021) and the Metaverse (Zhou et al., 2024).

We therefore applied Q methodology within an urban network comprising the five largest cities in a Dutch province. The actors in this network are actively involved in shaping innovation strategies for UDTs at both the city and regional levels and hold key positions within the region’s UDT value chain and innovation networks. They face strategic challenges, such as determining which developments to pursue independently or collaboratively, allocating limited resources effectively, and politically justifying UDT initiatives. Given the conceptual ambiguity surrounding UDTs and the need for clearer strategic direction, Q methodology was identified by the researchers and two initiating actors in the network, as a structured approach to uncovering shared and divergent perspectives within this innovation ecosystem.

3. Materials and methods

3.1. Overview

To develop the Q methodology, we conducted a comprehensive scan of UDTs at various development and deployment stages within the regional network (see above and Table 7) (Lee, 2017). We recruited the actors involved in these regional UDTs as respondents. To operationalise the social construction of the UDTs, we began with a keyword co-occurrence analysis to define the scope of the study and critical arguments (see Fig. 1 above). The Q sample is based on the keyword co-occurrence analysis and systematic literature review from document databases and included questions related to values to counter the current lack of emphasis in academic literature. This approach is necessary to collect the most representative statements from the significant volume of information related to UDTs. We clustered the statements into five categories, loosely based on innovation drivers in SCOT and ANT: Terminology, Values, Innovation, Impact and Strategy (see Tables 2 and 3). We employed online Q study software for card ranking exercises and real-time online and offline interviews. Leveraging the Q study online allows efficient production of quantitative data and speech-to-text notes for subsequent factor analysis and interpretation. The mathematical component is key in structuring the data analysis but remains relatively subdued and flexible (Akhtar-Danesh, 2023; Newman & Ramlo, 2010). In the next section, we elaborate on the steps of our study’s systematic online Q methodology.

3.2. Research questions

Based on the previous theoretical and conceptual analysis, the

research objectives and related empirical Research Questions (RQ) of the Q methodology study are:

Research objective 1: Understanding UDT as a Boundary Object and its interpretative flexibility, in an actor-network.

RQ 1: What are the socially constructed perspectives on UDTs among the actors in the regional urban network in the Netherlands?

RQ2: What are the similarities and differences between these actor perspectives?

Research objective 2: Understanding the Q-method as a form of Boundary Spanning in an actor-network.

RQ 3: To what extent can a Q study be used to support a UDT innovation in the regional urban network in the Netherlands?

3.3. General procedures

In this study, the Q methodology's digitalised processes and online procedures include the following stages as indicated in Fig. 2 (Zhou et al., 2024):

1. Use clustered keywords to search for academic publications and various communicative texts, such as essays, discussions, online news, books and personal opinions to identify prominent arguments.
2. Construct the Q sample for UDTs, which consists of a collection of statements (typically between 30 and 50) that capture the most significant arguments and opinions.
3. Select respondents through regional networks (P set, generally between 25 and 40) to ensure boundary spanning in a regional innovation ecosystem.
4. Conduct the Q sorting exercise in real-time using an online platform, where each respondent arranges the statements (Q sort) on a forced quasi-normal distribution grid (Q scale, ranging from -3 to $+3$, from strongly disagree to strongly agree).
5. Perform personal interviews with each respondent to clarify the reasoning behind their selection of the statements. Respondents give detailed explanations, which are recorded, and automatic transcripts are generated for further analysis.
6. Conduct Q factor analysis and verify the statistical findings by cross-referencing the interview notes from the respondents' Q sorts to determine the final outcomes of the analysis.
7. Reconstruct a concise set of perspectives, each interpreted by aligning the key statements with the labelled interview notes.

3.4. The Q sample of the UDTs

In step 1, we conducted a co-occurrence network analysis to identify the relevant themes around UDTs, such as smart cities, remote sensing, etc. (see above). The keywords are clustered based on the frequency of co-occurrence and were used to search for representative information within the clusters. This step was primarily intended to ensure a balanced representation of publications, and the other literature used to find and select Q sample statements.

In Step 2, a systematic document review was conducted using the themes from Step 1. The Scopus database was used to identify relevant references, and a Google search tracked the latest discourse on UDTs in journals, professional magazines and newspapers. In addition, commentaries from research seminars, blogs, books and book reviews were also included. A preliminary collection of approximately 130 items from the keywords-based search of various databases were abstracted.

In Step 3, we applied the SCOT/ANT theory to structure the items in the Q sample into six categories: Terminology, Values, Innovation, Impact and Strategy. These items were condensed and rephrased into approximately 80 short and clear statements to ensure that they

presented clear information and were expressed in natural language.

In Step 4, we reduced the number of statements in each category to make the total statement count manageable. We user-tested the 41 statements and procedures with persons in our inner circle.

The final number of Q sample statements in each category are: Terminology (T) = 5, Values (V) = 11 positively and 8 negatively formulated statements; Innovation (In) = 5, Impact (Im) = 5, and Strategy (S) = 7. In Table 1, one or two example statements in each category are provided alongside the cluster of keywords on which they are based. The complete list of statements and categories is given in Table 3.

With this design, the Q sample is comprehensively composed with a stronger focus on the Values and Strategy categories regarded as highly influential in government entity reports but limited in academic literature.

3.5. Participants and the Q Sort procedure

The design of the participant sample (P-set) focused on selecting individuals actively involved in UDTs in the Urban Network in a Dutch province. Participants were chosen based on two criteria: a) their professional involvement in UDT-related sectors, including urban planning, public policy and digital innovation; and b) their active engagement in discussions and activities surrounding UDTs, such as research projects, public forums, and strategic planning sessions in the urban digitalisation space.

Twenty-nine participants, aged between 27 and 62, took part in the Q sorting exercise and in-depth interviews (see Table 2). The sample was composed of individuals from both the public and private sectors, with a majority (23 participants) being civil servants from municipalities, the province and regional authorities. The remaining participants included representatives from private organisations (3) and knowledge institutions (3). Participants self-reported their knowledge of UDTs: two claimed to have expert-level understanding, sixteen had substantial knowledge, nine had moderate familiarity and one participant had basic knowledge.

The Q-sort process was conducted via physical and online meetings, using digital Q-sorting software. Participants were given a link to the online platform and were instructed to pre-sort statements into agreement, disagreement and neutrality categories. The sorting interface utilised a scale from $+3$ (strong agreement) to -3 (strong disagreement). Each Q-sort session lasted approximately 1 h, with about half the time for the card sorting task followed by explanation and reflection. Data collection and analysis were conducted using Q methodology software, with all interviews recorded and transcribed through speech-to-text technology. The resulting data were analysed to provide quantitative and qualitative insights into participants' perceptions of UDTs.

3.6. Analysis and interpretation

In Q methodology, data analysis often involves applying factor analysis using software tools like the PQ method.¹ However, identifying significant factors requires more than statistical measures; additional theoretical insights and qualitative considerations must be determined to align with the Q design and dataset (McKeown & Thomas, 1988). For this study, we conducted data analysis using the embedded statistical features of the online QMethod Software. Standard procedures in Q methodology, such as Pearson correlation, Principal Component Analysis (PCA) and Varimax rotation, were applied for factor extraction and rotation. Pearson correlation generated a matrix of correlations between individual Q sorts (by-person correlation), while PCA identified eight factors with *eigenvalues* greater than one. Factor loadings of ± 0.40 were

¹ The embedded analytical function of the online QMethod Software is regarded as equivalent to the freely distributed PQMethod tool as the standard analysis for Q methodology.

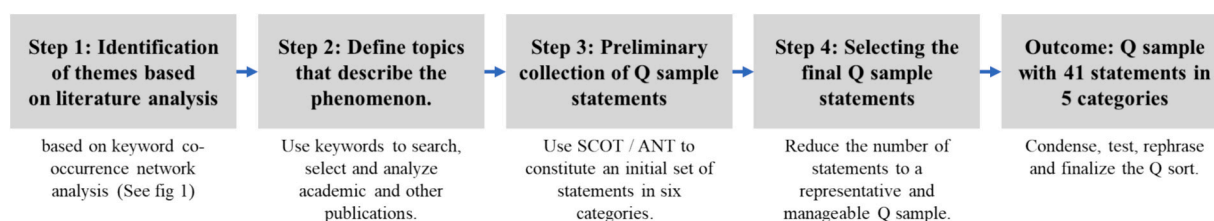


Fig. 2. Constructing a Q sample.

Table 1
Q sample with example statements.

	Categories	Number	Example
The essential elements of UDT discourse	Terminology (T) = what UDT essentially means	5	e.g., A digital twin is a digital copy of a physical object or artifact that exists in the real world; A digital twin is nothing more than an advanced simulation model.
	Values (Vp,n) = what UDTs can potentially deliver to society	11 pos. and 8 neg.	e.g., Urban Digital Twins have the potential to make decision-making more based on facts; Urban digital twin is an inflated concept because it cannot deliver on what it claims.
	Innovation (In) = what UDTs can innovatively do	5	e.g., One of the most important functions of an urban digital twin is real-time measurement and monitoring; One of the most important functions of an urban digital twin is the ability to calculate and predict the future consequences of decisions.
	Impact (Im) = where UDTs can be used and what they deliver	5	e.g., Urban Digital Twins can improve the resilience of urban areas against, for example, natural disasters and pandemics; Urban Digital Twins can improve citizen participation.
	Strategy (S) = how UDT development and use can be managed	7	e.g., The development and use of Urban Digital Twins should be left to the market and depend on supply and demand; It is important that local and regional authorities actively support the development of a technical and organizational infrastructure for urban digital twins.

Table 2
Sectors with which the participants are associated.

Sector	Number
Public sector (civil servants)	23
Private sector	3
Academia	3

considered significant. These extracted factors were refined and rotated to achieve the desired factor structure (Akhtar-Danesh, 2023).

In Q methodology, the choice of factor rotation methods and criteria varies depending on the study's objectives and is often shaped by the researcher's specific focus. We rotated factor solutions representing between 50 % and 80 % of cumulative variance to compare different factor

structures. We employed Varimax rotation, which optimises the variance explained by the extracted factors, aiming to capture the broadest range of perspectives (Akhtar-Danesh, 2023).

We compared solutions involving three to eight factors to assess significant factor loadings and their corresponding arrays. Interview notes were incorporated into the analysis to support and validate these decisions. We also applied a more rigorous standard for identifying significant factor loadings to maximise the variance explained (Watts, 2012). Q sorts that showed significant loadings on more than one factor were excluded as 'confounded'. The final factor solution was interpreted using the distinguishing statements for each factor and broader narratives derived from interview notes. To develop a comprehensive understanding of each perspective, relevant statements from various SCOT categories were integrated, and the interview notes from participants associated with each factor were systematically coded for deeper insights.

To explore the commonalities among the perspectives, we compared consensus statements to reveal shared viewpoints, or 'common ground'. These statements reflected areas of agreement across different perspectives. Additionally, the content of the interview notes, including frequently used words and narrative themes, was analysed to further explain shared patterns and underlying perceptions. Preliminary interpretations of the perspectives were shared with participants to ensure the accuracy and reliability of the findings, and their feedback helped enhance the rigour and validity of the study's conclusions.

We examined whether the Q-factors correlated with participants' backgrounds (e.g., age, gender) or formal positions (e.g., municipal planner, academic, technology developer, public-private sector, UDT pilot). No strong associations were identified with any of the Q-factors. This is not uncommon in Q methodology studies, where individuals from different professional backgrounds may share similar perspectives, while those in comparable roles may hold distinct views. The limited number of participants with varying backgrounds and positions may have contributed to this outcome. Furthermore, the study was conducted within a relatively cohesive urban network, which could have influenced the results. Future research could explore how findings differ when the Q set is extended to a broader and more diverse participant pool.

4. Results

The factor analysis, performed using PQMethod software, identified three factors as the most suitable to represent the varying perspectives within the UDT discourse. These factors explained 53 % of the variance across participant responses. The full factor array and significant factor loadings appear in Annex Tables 4–7. After interpreting each factor, we discuss the similarities and differences between the factors.

4.1. Factor 1: strategic confidence in urban digital twins

With 15 participants loaded significantly on Factor 1, they form a prevalent perspective based on 15 distinguishing statements and two consensus statements (see Tables 3 and 5). Respondents demonstrate a strategic, forward-looking attitude towards UDTs. According to the respondents, UDTs' ability to predict and calculate the consequences of

urban decisions is one of their most essential functions (In3, +3), as it is crucial for future urban planning and governance. This predictive function is seen as a vital tool for making more informed, data-driven policies that support long-term urban development.

Respondents also emphasise UDTs' capacity to enhance stakeholder engagement (Vp9, +3). By providing comprehensive real-time data, UDTs can help diverse groups, from policymakers to citizens, contribute to urban decision-making processes. Respondents believe that UDTs offer a way to balance competing urban priorities, such as safety, sustainability and accessibility (Vp3, +2). This balancing act is essential for creating urban environments that meet various needs while maintaining long-term resilience.

There is consensus that local and regional authorities should actively support the development of UDT infrastructure (S6, +2). Respondents highlight the importance of public-private collaboration, stressing that governments, businesses and knowledge institutions need to coordinate their efforts (S5, +2). Moreover, they emphasise the need to raise awareness among policymakers about UDTs' potential benefits, particularly in improving urban resilience against disasters and pandemics (Vp5, +1).

However, despite their optimism, respondents acknowledge certain limitations. While they agree that UDTs can improve urban resilience (Vp5, +1), they do not strongly believe UDTs should serve as a central control hub for cities (Vp1, +1). Instead, they see UDTs as one part of a broader urban planning toolkit that requires further development in areas like stakeholder coordination and communication.

Respondents also value UDTs as tools for scenario testing, enabling decision-makers to explore various potential outcomes (Vp2, +2). They view this exploratory function as crucial for fostering collaborative learning processes among different stakeholders. In the future, respondents believe that decision-makers and stakeholders will work together within the same UDT ecosystem to enhance collaboration and governance (Im4, +0).

In terms of disagreement, respondents reject the notion that UDTs are biased or non-transparent (Vn1, -1). They also disagree with the idea that UDTs are merely advanced simulation models (T1, -3). Instead, UDTs are seen as promising tools with the potential to deliver meaningful insights if they are implemented and used effectively.

In summary, the respondents in this factor hold a forward-looking and optimistic view of UDTs, recognising UDTs' potential to improve decision-making, foster stakeholder collaboration and balance vital urban priorities. They see UDTs as tools that can help cities become more resilient and better managed, provided local authorities and stakeholders have adequate support and awareness.

4.2. Cautious critique of Urban Digital Twins

Five participants significantly loaded on Factor 2, reflecting a more sceptical perspective shaped by eight distinguishing statements and three consensus statements (see [Tables 3 and 5](#)). Respondents in this factor adopt a critical stance towards UDTs, focusing on the risks, limitations and challenges they perceive. The lack of high-quality, reliable data is a primary concern (Vn3, +3). Without addressing data quality issues, respondents believe that UDTs will fall short of their promises, as accurate and comprehensive data are fundamental to effective urban decision-making.

Another major concern is the insufficient training of decision-makers in using UDTs (S4, +3). Respondents argue that proper training is essential for decision-makers to fully grasp the impact of UDTs on governance and planning. They fear that without sufficient training, UDTs will be underutilised, preventing them from making a meaningful contribution to urban planning efforts.

Respondents also call for more research into the ethical, social and political implications of UDTs (S3, +3). They are particularly concerned about the potential for bias in UDT interfaces, worrying that these systems could filter or distort data (Vn1, +3), leading to unbalanced

decision-making. This reflects a broader scepticism about the objectivity of UDTs, with respondents questioning whether the technology can be trusted to provide unbiased insights.

In addition to these concerns, respondents highlight the complexity of UDTs and their dependence on the availability of high-quality data (Vn3, +3). They argue that without improving data quality and transparency, UDTs may not offer accurate or reliable information, which could undermine their use in critical decision-making processes. Furthermore, respondents stress that decision-makers need more training (S4, +3) before UDTs can be fully integrated into urban governance systems.

They are also cautious about the high expectations placed on UDTs (Vn2, +2). They note that UDTs have not yet proven their ability to meet the ambitious claims associated with them, particularly due to unreliable simulation models (Vn5, +2). Respondents also point to the lack of transparency and accessibility for non-experts (Vn7, +1) as further evidence of UDTs' limitations, making it difficult for a broad range of stakeholders to engage with the technology.

Despite these criticisms, respondents in Factor 2 do not dismiss UDTs entirely. They acknowledge that with sufficient improvement in data quality and training, UDTs could provide valuable insights into urban management. However, they caution against over-reliance on the technology, stressing that it should complement, not replace, human decision-making processes.

While respondents agree that local and regional authorities should support UDT infrastructure (S6, +1), they do not believe UDTs will fundamentally change spatial planning (Im2, -1) or become a central control hub (Vp1, -3). Their scepticism is rooted in a belief that UDTs are not yet ready for large-scale adoption and still require significant development.

In summary, respondents in this factor maintain a cautious and critical view of UDTs. While they recognise the potential for future development, they are not convinced that UDTs are ready to play a central role in urban planning. Concerns about data quality, transparency and ethical issues suggest a need for more comprehensive evaluation before UDTs can be more widely adopted.

4.3. Technological pragmatism for Urban Digital Twins

Seven participants significantly loaded on Factor 3, representing a pragmatic and grounded perspective on UDTs. This group views UDTs as valuable practical tools that can assist in improving visualisation, citizen participation and data integration, focusing primarily on what UDTs can do now rather than their future potential to transform urban governance. These respondents' perspective is defined by 10 distinguishing statements and 2 consensus statements (see [Tables 3 and 5](#)).

One of the central views of this group is that a UDT genuinely is a digital copy of a physical object or artifact that exists in the real world (T2, +3). This group highlights the practical role of UDTs in integrating large amounts of geodata (In5, +3), helping decision-makers and stakeholders visualise and understand complex urban landscapes. They believe that UDTs can enhance public participation (Vp7, +3) by making urban planning processes more transparent and accessible through 3D visualisation (In1, +2). These visual tools are seen as critical for engaging non-experts, ensuring that citizens can meaningfully contribute to urban development decisions.

This group also holds a relatively optimistic view regarding UDTs' potential to improve spatial planning (Im2, +1), though their focus remains on current, practical applications. They believe that UDTs can calculate and predict the future consequences of decisions (In3, +2), helping policymakers explore different scenarios. However, unlike participants who loaded on Factor 1, who view UDTs as potentially transformative for governance, this group emphasises user-friendly, immediate applications, such as allowing interaction with UDTs to be as easy as using a computer game (In4, +1).

While pragmatic, respondents are cautious about the technical

limitations of UDTs; they do not see UDTs as comprehensive solutions for all urban challenges, particularly when it comes to modelling complex socio-economic and political behaviours (T4, -3). They also recognise the lack of coordination between public and private organisations as a hindrance to effective UDT implementation (Vn6, -2), highlighting the need for better collaboration to unlock the full potential of UDTs. Although they see UDTs as valuable tools for enhancing participation and visualising cities, they are aware that these technologies are still in development and face challenges that need to be addressed.

Notably, this group does not seem to reject the idea of a single UDT for the whole of the Netherlands (S7, 0), reflecting their belief that large-scale UDT integration could further facilitate planning and data sharing across regions. However, they reject the notion that UDT development should be left entirely to market forces (S1, -3), stressing the need for oversight and coordination among stakeholders to ensure that the technology serves public interests.

In summary, Factor 3 sees UDTs as pragmatic tools for visualisation and participation, focusing on UDTs' current applications rather than future transformations. This group calls for balanced development, recognising UDTs' limitations while valuing their ability to engage citizens and improve urban planning in the short term.

4.4. Similarity and differences

Table 6 (Annex) provides correlation scores that highlight areas of agreement and divergence. For instance, Factor 1: Strategic Confidence and Factor 2: Cautious Critique share minimal alignment, with a correlation score of just 0.18, indicating <18 % overlap. The gap between Factor 2 and Factor 3: Technological Pragmatism is even more pronounced (0.08). However, Factor 1 and Factor 3 show stronger agreement, correlating at 0.60, which suggests that these perspectives share similarities in approximately 60 % of the cases. But what do these figures imply for understanding the perspectives?

In short, the three perspectives – Strategic Confidence, Cautious Critique and Technological Pragmatism – provide distinct views on how UDTs should be developed, governed and applied. Although there are areas of overlap, the key differences revolve around the scope and approach to UDTs: Factor 1 focuses on their transformative future potential, Factor 2 highlights the risks and limitations and Factor 3 emphasises UDTs' practical, current applications.

4.4.1. Strategic Confidence versus Cautious Critique

Factor 1 and Factor 2 represent two ends of the spectrum. Strategic Confidence respondents (Factor 1) are highly optimistic about UDTs' potential to transform urban governance. They believe UDTs can significantly improve decision-making by predicting and calculating the consequences of policies (In3, +3), and they see governments playing a crucial role in supporting UDT infrastructure. This group emphasises the long-term potential of UDTs as strategic tools for enhancing urban resilience, fostering stakeholder engagement and addressing complex challenges. In contrast, Cautious Critique respondents (Factor 2) are far more sceptical. They emphasise that UDTs cannot be trusted as neutral or reliable decision-making tools due to inherent biases in how data are presented (Vn1, +3) and limitations in data quality (Vn3, +3). These critics do not share Factor 1's confidence that UDTs can significantly improve fact-based decision-making (Vp10, -2). They highlight the risks of relying on UDTs without addressing these issues and argue that more research is needed into the ethical, social and political implications of the technology. This group warns against the 'techno-fixation' often associated with UDTs and the dangers of positioning them as control hubs for cities (Vp1, -3).

4.4.2. Strategic Confidence versus Technological Pragmatism

While Strategic Confidence (Factor 1) and Technological Pragmatism (Factor 3) share more in common, particularly their belief in the

potential of UDTs to improve urban governance (correlation 0.60), they differ in their approach to the technology's application. Strategic Confidence respondents focus on the long-term potential of UDTs as transformative tools, seeing them as essential for strategic urban planning and decision-making. These respondents are more visionary in their outlook, believing that UDTs will fundamentally reshape how cities are managed.

By contrast, Technological Pragmatism respondents take a more practical and grounded approach, emphasising UDTs' current, real-world applications (T2, +3). This group focuses on the technology's immediate utility for visualisation, citizen engagement and incremental progress in urban planning rather than expecting UDTs to revolutionise urban governance. They see UDTs as valuable tools for integrating geodata and facilitating participation through 3D modelling (In1, +2), but they acknowledge the limitations of UDTs in modelling complex socio-economic behaviour (T4, -3). Unlike Factor 1, they are sceptical of positioning UDTs as central tools for long-term governance and instead advocate for their use in specific, tangible projects. These respondents also reject a purely market-driven approach to UDT development (S1, -3), advocating for public oversight and collaboration with municipalities.

4.4.3. Cautious Critique versus Technological Pragmatism

The Cautious Critique (Factor 2) and Technological Pragmatism (Factor 3) perspectives have minimal overlap (correlation 0.08). However, both groups share some scepticism about certain UDT functions. For example, both agree that UDTs are not well-suited for modelling complex socio-economic behaviour (T4, -3) and that the quality of UDT data needs improvement. However, their overall views on UDTs are starkly different. Where Cautious Critique respondents see UDTs as fraught with ethical and transparency issues, Technological Pragmatism respondents take a more optimistic view, focusing on UDTs' ability to address practical urban challenges through visualisation and data integration. While Cautious Critique respondents argue for more research and training to mitigate the risks of UDTs (S4, +3), Technological Pragmatism respondents believe the technology is already useful in its current form and can gradually improve over time.

5. Conclusion

5.1. Answering the empirical research questions

RQ 1: What are the socially constructed perspectives on UDTs among the actors in the regional urban network in the Netherlands?

Our study identified three distinct perspectives on UDTs: Strategic Confidence, Cautious Critique and Technological Pragmatism. These perspectives illustrate varying emphasis on Terminology, Values, Societal Impact, Innovation and Strategy. Rather than merely debating the definitions or technology of UDTs, the participants focused on the cultural values and societal impacts associated with their implementation. For instance, the Strategic Confidence perspective highlighted the potential of UDTs to promote data-driven policies and enhance urban resilience, while the Cautious Critique participants expressed concerns about data quality and ethics in decision-making. This demonstrates that the definitions and essential features of effective UDTs are less important than the political, social and economic implications surrounding their adoption.

RQ2: What are the similarities and differences between these actor perspectives?

The three perspectives reflect varying degrees of confidence, pragmatism, and concern regarding the role of UDTs in urban governance. The key differences lie in how UDTs should be applied and their perceived potential. Factor 1 is visionary, focusing on strategic and transformative uses for the future; Factor 2 is cautious, emphasising risks and the need for further research; and Factor 3 is pragmatic,

focusing on practical, current applications and incremental improvements. Differences also emerge in attitudes towards the societal impact of UDTs—particularly in levels of confidence in UDTs as systemic technological innovations, degrees of optimism or scepticism about their usefulness, and views on who should lead innovation (government, market, or society).

Despite these differences, all three perspectives recognise the potential value of UDTs for urban governance, provided they are implemented thoughtfully and responsibly. A common understanding exists around the role of UDTs in enhancing stakeholder engagement and supporting decision-making processes. A recurring theme across the perspectives is the need to ensure broad and fair access to UDTs for all stakeholders. These shared and divergent views contribute to a more nuanced understanding of how UDTs are perceived within the urban governance context.

RQ3: To what extent can a Q study be used to support a UDT innovation in the regional urban network in the Netherlands?

The Q method interviews were engaging and sparked curiosity among participants. Study findings were presented at regional meetings, bringing together UDT stakeholders, interviewees, and others from various sectors. Stakeholders showed great interest in the Q method and results, recognising its value in capturing diverse perspectives and highlighting opportunities in the regional innovation ecosystem. The Q method facilitated cross-sectoral dialogue, helping to identify common goals and challenges, which we conceptualized as boundary spanning.

Discussions within the urban network led to concrete innovation and R&D proposals, advancing UDT implementation. Stakeholders emphasized the need to break down institutional silos and enhance collaboration to accelerate UDT adoption. They highlighted the importance of an integrated regional approach to tackling challenges such as housing, mobility, climate, and the energy transition. UDTs were seen as powerful tools for harmonizing data, enabling more coordinated decision-making, and improving citizen participation through enhanced data visualisation.

Many respondents noted that UDTs remain in their early stages, with limited knowledge-sharing, inconsistent practices, and gaps in technical expertise among policymakers and professionals. This highlights the need for best practices, increased awareness, and the creation of joint data spaces to improve collaboration and integration. Stakeholders also stressed the importance of interdisciplinary research to bridge gaps between technology development and policy implementation.

The Q study and subsequent discussions inspired several initiatives, including the coordinated application of three different UDT platforms in an urban reconstruction project and the development of joint R&D proposals to refine their use.

Ultimately, the Q study proved to be an effective tool for fostering collaboration and aligning stakeholders around shared goals. It demonstrated UDTs' potential to bridge gaps between governments, businesses, and citizens, supporting co-creation and long-term urban planning.

5.2. Discussion

5.2.1. Limitations

This study, which included 29 participants from various sectors involved in UDTs, provides valuable insights into how UDTs are perceived by policymakers, researchers and industry professionals. However, several limitations that affect the broader applicability and depth of the findings must be acknowledged.

Given the specific context and action orientation of the (commissioned) study, participants were selected from within the same regional innovation ecosystem. i.e., an urban network in the Netherlands; most participants worked in government or the public sector, and many were familiar with one another, introducing potential bias. In that sense, the P (participant)-set reached a point of saturation and within time and availability conditions, all relevant actors in the region were

interviewed.

Although this allowed for a focused examination of UDTs within a specific community, the homogeneity of professional backgrounds may have limited the diversity of viewpoints, particularly those from less connected stakeholders, critical academics, or pioneering technology developers. This limits generalizability of the findings to other regions in the Netherlands, or internationally.

The factors did not appear radically different, and factors 2 and 3, have significant less respondents than factor 1. This is not uncommon in Q-study findings, since discourses often consist of one or two dominant actor-network perspectives, with several, partially overlapping, diffuse perspectives around it.

Future research would benefit from including a more heterogeneous group of participants to better capture the multiplicity of perspectives on UDTs, such as participants from other regions or countries, from social sciences, humanities, ethics, and digital technology firms.

Expanding the P-set with a broader range of participants could provide further insights into whether an individual's background, formal position, or involvement in UDT use-cases influence their perspective on UDTs.

A Q study relies on the quality of its statements, the Q-sort, and while we aimed for a balanced and meaningful set within the context of this regional urban network, there may be latent or emerging perspectives on UDT that were not captured in the Q-sort and P-set. Future Q-studies could incorporate more provocative, futuristic, or critical statements to explore whether such perspectives on UDT exist.

5.2.2. Implications to theory and practice

This study contributes to both the theoretical discourse on urban digitalization and the practical development of Urban Digital Twins (UDTs) as sociotechnical systems. By applying Q methodology within a regional actor-network, we provide conceptual and empirical insights into how diverse stakeholder perspectives shape UDT innovation.

The findings highlight the dual nature of interpretative flexibility in UDTs, reinforcing the relevance of Social Construction of Technology (SCOT) and Boundary Object (BO) theories. While too much ambiguity can lead to fragmentation and misalignment, too little can stifle innovation by imposing rigid definitions that exclude alternative perspectives. A productive middle ground is essential—UDTs must be flexible enough to accommodate different interpretations while structured enough to support collaboration. An important direction for future research is identifying where this balance should be struck in practice.

Actor-Network Theory (ANT) further clarifies that UDTs do not evolve in isolation but through dynamic interactions among policymakers, technologists, urban planners, and citizens. However, these interactions are only effective if actors recognise where and how their perspectives differ. This study demonstrates that Q methodology serves as a boundary-spanning tool by structuring these differences into recognizable patterns, helping actors engage in the construction of meaning, rather than simply exchanging opinions.

By structuring discourse around UDTs, Q methodology helps stabilise innovation networks, preventing both conceptual stagnation and fragmentation. This approach can be applied beyond UDTs to other socio-technical innovations, including the broader smart city concept, where balancing interpretative flexibility with structured coordination is equally critical.

From a practical standpoint, the three identified perspectives—Strategic Confidence, Cautious Critique, and Technological Pragmatism—demonstrate that UDT adoption depends on how different actors assess its risks and benefits. Strategic Confidence respondents support government-led expansion and long-term investment. Cautious Critique respondents call for stronger oversight, ethical safeguards, and data transparency. Technological Pragmatists stress incremental, application-driven improvements.

These differences imply that a uniform strategy for UDTs is unlikely to succeed. Instead, policymakers should adapt UDT governance models

to specific needs, balancing long-term investment with near-term usability, while remaining critical about limitations and consequences. This differentiation is key to avoiding both over-regulation and under-utilization. For policymakers and urban practitioners, these findings emphasise the need for targeted stakeholder engagement and structured decision-making processes. Rather than imposing rigid implementation models, a modular and adjustable governance approach—which allows UDT applications to evolve based on local priorities—may be more effective in supporting adoption.

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CRedit authorship contribution statement

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original draft, Writing – review & editing, Formal analysis, Visualization, Project administration, Funding acquisition. **Igor Mayer:** Conceptualization, Supervision, Funding acquisition, Methodology, Writing – original draft, Writing – review & editing. **Qiqi Zhou:** Software, Methodology, Formal analysis, Data curation, Writing – original draft.

Declaration of competing interest

The authors declare no conflict of interest.

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Annex

Table 3

Factor array with distinguishing statements of each factor.

Cat	No	Statement Factor	Ideal Rank		
			1	2	3
In3	1	One of the most important functions of an urban digital twin is the ability to calculate and predict the future consequences of decisions.	3	0	2
Vp8	2	Urban Digital Twins can be used to communicate how the city or region may develop in the future.	3	0	2
Vp7	3	Urban Digital Twins can improve citizen participation.	2	1	3
Vp2	4	Urban Digital Twins are a tool for learning from different scenarios.	2	2	2
Im3	5	Urban Digital Twins will change the way stakeholders help shape their city or region.	1	2	3
Vp10	6	Urban Digital Twins have the potential to make decision-making more based on facts.	3	–2	2
Vp9	7	Urban Digital Twins can significantly improve stakeholder engagement.	3	0	1
S5	8	Public-private organisations and knowledge institutions must coordinate collaboration and development in the use of urban digital twins.	2	1	0
Vp3	9	An urban digital twin helps find a balance between different values, such as safety, sustainability, and accessibility, within spatial planning.	2	0	1
S6	10	It is important that local and regional authorities actively support the development of a technical and organizational infrastructure for urban digital twins.	2	1	–1
S3	11	More research is needed into the ethical, social, and political consequences of urban digital twins.	0	3	0
S2	12	Policymakers and stakeholders need to be more aware and informed about urban digital twins.	1	2	–1
S4	13	Decision-makers need more training in using Urban Digital Twins before this technology can be widely adopted.	0	3	0
In5	14	One of the most important functions of an urban digital twin is to integrate and harmonize large amounts of geodata.	–1	–1	3
Vp6	15	Urban Digital Twins can integrate the plans of different stakeholders into one integrated urban design.	1	0	1
T3	16	A digital twin can capture ideas, concepts, and designs that do not (yet) exist.	1	0	1
Vp11	17	Urban Digital Twins can be used to mediate spatial conflicts.	0	–1	1
Vn3	18	Urban Digital Twins are hampered by a lack of availability and quality of data.	0	3	–1
Im2	19	Urban Digital Twins will fundamentally change spatial planning.	0	–1	1
Vp4	20	Urban Digital Twins have great potential for local and/or regional economic development.	0	1	0
Im1	21	An urban digital twin is a “must-have” for smart cities and regions.	1	–3	0
Im4	22	In the future, decision-makers and stakeholders will work together in one and the same urban digital twin.	0	1	0
Vn1	23	Urban Digital Twins are not neutral or objective because interfaces filter and colour what we see.	–1	3	–2
Vp5	24	Urban Digital Twins can improve the resilience of urban areas against, for example, natural disasters and pandemics.	1	0	–2
In1	25	One of the most important functions of an urban digital twin is a 3-Dimensional visualisation of the city or region.	–1	0	2
In4	26	One of the most important characteristics of an urban digital twin is that user interaction is as easy as in a computer game.	–1	0	1
T2	27	A digital twin is a digital copy of a physical object or artifact that exists in the real world.	–2	–2	3
Vn6	28	Urban Digital Twins are hampered by a lack of coordination between public and private organisations.	0	1	–2
Vn7	29	Urban Digital Twins are hampered by a lack of transparency and openness to non-experts.	–1	1	0
Vp1	30	Urban Digital Twins become the control room for a city or region.	1	–3	0
In2	31	One of the most important functions of an urban digital twin is real-time measurement and monitoring.	0	–2	–1
Vn4	32	Urban Digital Twins are hampered by the lack of digital security.	–2	–1	–1
Vn8	33	Urban Digital Twins are hampered by the lack of interconnected urban sensors.	–1	–1	–2
Vn2	34	Urban digital twin is an inflated concept because it cannot deliver on what it claims.	–3	2	–2
S7	35	It would be a good idea to have one digital twin for the whole of the Netherlands.	–2	–3	0
Vn5	36	Digital twins are not useful for decision-making because data and simulation models are still unreliable.	–3	2	–3
T1	37	A digital twin is nothing more than an advanced simulation model.	–3	–1	–1
T4	38	A digital twin is able to model complex socio-economic and political behaviour.	–1	–1	–3
Im5	39	In the (near) future, the output of a digital twin will have more authority in decision-making than the knowledge of an expert.	–2	–2	–1
S1	40	The development and use of Urban Digital Twins should be left to the market and depend on supply and demand.	–2	–3	–3
T5	41	Digital twins are a technological monstrosity in the hands of Big Tech.	–3	–2	–3

T = Terminology / V=Values+ / – / SI = Societal Impact / I = Innovation / S=Strategy.

Table 4
Significant loadings of each factor.

Participants (in each factor loading)		Degree of significant correlation of Q sort with each factor (* = flagged as statistically relevant and robust respondent/statement loading).				
Part.No	Part. code	Factor 1		Factor 2	Factor 3	
1	0W58	0.80	*	0.17	0.17	
2	2MWS	0.56		0.22	0.57	
3	2YKH	0.15		0.30	0.45	*
4	4SID	0.71	*	0.04	0.26	
5	71PP	0.67	*	0.01	0.35	
6	7A14	0.47		−0.20	0.46	
7	8JOV	−0.10		0.58	0.42	*
8	9PC6	0.42	*	−0.11	0.35	
9	BG8C	0.44	*	0.00	0.35	
10	BU1D	0.22		−0.24	0.79	*
11	CKJM	0.06		0.82	0.14	
12	D29P	0.30		0.03	0.63	*
13	D4FM	0.06		0.52	−0.10	
14	G45H	0.31		0.17	0.60	*
15	HC9B	0.52	*	0.07	0.47	
16	HCLA	0.51	*	0.16	0.07	
17	I75Y	0.59	*	−0.05	0.09	
18	IOTV	0.00		0.72	0.19	
19	M3KG	0.61	*	0.28	0.26	
20	PK1J	0.64	*	0.15	0.38	
21	PZ6E	−0.04		0.23	0.63	*
22	QY56	0.38		−0.21	0.77	*
23	SPYE	0.56	*	0.24	0.39	
24	TZHY	0.62	*	0.32	−0.04	
25	UT35	0.56	*	0.28	0.46	
26	UXAE	0.23		0.31	0.44	*
27	WATE	0.24		0.73	−0.18	
28	XOIF	0.70	*	−0.18	0.48	
29	ZRT8	0.85	*	−0.11	0.04	

Table 5
Factor descriptives.

	Factor 1	Factor 2	Factor 3
No. of defining variables	15	5	7
Avg. Rel. Coef.	0.8	0.8	0.8
Composite reliability	0.98361	0.95238	0.96552
S.E of factor Z-scores	0.12804	0.21822	0.1857

Table 6
Correlation between factors.

	Factor 1	Factor 2	Factor 3
Factor 1	1	0.18471	0.6011
Factor 2	0.18471	1	0.08164
Factor 3	0.6011	0.08164	1

Table 7
Case studies with UDT in the region (simplified table, cases until July '23).

	Project	Organization(s)	Focus	DT level
1	Smart City Alkmaar	Analysis and Municipality of Alkmaar	Urban planning, housing stock monitoring	Digital model
2	Almere Digital Twin	Municipality of Almere	3D model for permits	Digital model
3	3D Amsterdam	Municipality of Amsterdam/Unity	City planning: 3D map buildings, roads, vegetation, subsurface	Digital model
4	3D Digital City	Municipality of Groningen/ArcGis	City planning: 3D map buildings, roads, vegetation, subsurface	Digital model
5	Brainport Smart District Digital Twin	Municipality of Helmond/Geodan	Visualising future homes for residents	Digital model
6	Lekdijk Digital Twin	De Stichtse Rijnlanden Water Board/Geodan	Above and below the Lekdijk	Digital model
7	Netherlands in 3D	Future Insight, Sweco, Avineon, Nelen & Schuurmans, Cobra, Kavel10	3D Visualisation	Digital model
8	3DNL	Hexagon and Cyclomedia	Mesh measurements, asset management, shadow analysis, solar capacity calculations and building cross-sections	Digital model

(continued on next page)

Table 7 (continued)

	Project	Organization(s)	Focus	DT level
9	Atlas liveable city	LCB, Argaleo and BUAS	Economic development of industrial estates, accessibility of top economic centres or logistics functions and use of buildings	Digital model
10	Virtual Zeeland	Province of Zeeland	Provides insight into land use and flood risk	Digital model
11	Rotterdam 3D	Municipality of Rotterdam/Tygron	City planning: 3D map buildings, roads, vegetation, subsurface	Digital model
12	3D Utrecht	Municipality of Utrecht/Unity	City planning: 3D map buildings, roads, vegetation, subsurface	Digital model
13	Zwolle Digital Twin	Land registry	City planning: 3D map buildings, roads, vegetation, subsurface	Digital model
14	3D City Model	Municipality of Eindhoven/ESRI	Interactive digital twin to calculate and visualise policy choices	Digital generator
15	Geoenvironment	Geodan	Calculate noise pollution	Digital generator
16	Breda & Den Bosch Smart city monitor	Municipality of Breda, 's-Hertogenbosch	Crowd and traffic management for bicycle traffic with real-time information	Digital shadow
17	Den Bosch Crowd Management Dashboard	Municipality of 's-Hertogenbosch and Argaleo	Real-time crowd management	Digital shadow
18	The Hague Digital Twin	Municipality of The Hague and Argaleo	Monitoring flows of pedestrians and cyclists	Digital shadow
19	Digital twin Deventer by Tauw	Municipality of Deventer, Tygron, Tauw, Esri	Free drawing, heat stress	Digital shadow
20	Nijmegen 3D Twin City	Nijmegen, Police, Safety Region, Four-day celebrations, Esri	Event permits, crowd management for events, preparation of security services	Digital shadow
21	Tygron Platform	Tygron	Urban planning platform with features such as environmental impact assessments, traffic analysis and scenario analysis	Digital shadow

Data availability

Data will be made available on request.

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