Theme Article: Digitalization of Smart Ecosystems

Smart Ecosystems and Digital Twins: an architectural perspective and a FIWARE-based solution

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Abstract—Smart ecosystems today span several sectors, including smart manufacturing, energy management, smart cities, smart healthcare, precision farming, and others. Digital Twins (DTs) are emerging as a powerful technology that can act as the digital backbone of a smart ecosystem, providing the data, insights, and control capabilities needed for real-time optimization and collaboration among involved entities. In this paper, we focus on the architectural integration of DTs within smart ecosystems, addressing interoperability challenges and aligning with identified DT requirements. We introduce DT-enabled Ecosystem (DTE) architecture structured in: i) Logical View, outlining key DTE entities and relations; ii) Technological View, mapping entities and requirements onto FIWARE components; iii) Development View, providing low-level description in a smart mobility case study. This multi-view approach facilitates the deployment and scalability of DTs in diverse smart ecosystem scenarios.

S mart ecosystems connect physical devices and digital tools to improve processes across various sectors (e.g., smart cities) [1]. Their evolutionary dynamics and reliance on heterogeneous data sources challenge their technical sustainability, i.e., their ability to maintain the quality of service over a prolonged time.

In recent years, the **Digital Twin** (DT) paradigm has become a cornerstone of innovation, gaining traction in a wide range of contexts, including smart ecosystems. Digital Twins act as virtual replicas of physical assets, continuously updated with real-time data and augmented with advanced control and predictive functionalities [2], [3]. Consequently, DTs serve as a valuable source of data for smart ecosystems while actively contributing to their operation. They enable realtime information exchange with other physical systems and various DTs—both those representing different aspects of the same physical system and DTs from different subsystems [1].

interoperability, not addressed by current solutions. These challenges impede the application of DTs to smart ecosystems and even raise questions about the necessity of doing so. At current state, there are a few popular platforms for the implementation of smart ecosystems and DTs, including Microsoft Azure¹, Amazon Web Service (AWS) Twin Maker², Eclipse Ditto³ and FIWARE⁴. Although

Notwithstanding the growing interest in DTs recently

shown by academia and industry, their engineering

remains an intricate endeavor. This complexity arises

from the absence of a standardized definition and

a unified, domain-independent architecture. Despite

the numerous proposals for DT architectures (e.g.,

[4], [5]), these are still often presented in a onedimensional manner, leading to predominantly domain-

specific solutions [6]. Moreover, the interdependence

between software components and heterogeneous

devices introduces issues related to data sharing and

Twin Maker², Eclipse Ditto³ and FIWARE⁴. Although Azure and AWS offer comprehensive suites of services for building and deploying applications and benefit from

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F. Rocco di Torrepadula and A. Somma equally contributed to the methodology, research, writing and illustration. A. De Benedictis contributed to the methodology and writing. N. Mazzocca supervised the research. XXXX-XXX © 2024 IEEE Digital Object Identifier 10.1109/XXX.0000.0000000

¹https://azure.microsoft.com/

²https://aws.amazon.com/it/iot-twinmaker/ ³https://eclipse.dev/ditto/ ⁴https://www.fiware.org/

strong communities and support, they are subject to vendor lock-in and may be very expensive for large deployments. If a lightweight and easy-to-use platform for smaller-scale implementations is needed, Eclipse Ditto may be a good option [7]. For large-scale deployments, FIWARE stands out as a formidable open-source tool to cope with data management, interoperability, and scalability, thanks to the numerous software components offered to help collect, process, and visualize data, and their adherence to open standards that ensures seamless integration among different systems and devices.

In light of the above considerations, this paper aims to facilitate the integration of DT technology within smart ecosystems by defining the architecture of a **DT-enabled Ecosystem** (**DTE**). The proposed DTE architecture is structured across three *Architectural Views*, inspired by Krutchen's View Model [8]: the Logical View, the Development View, and an additional Technological View that bridges high-level concepts with low-level architectural details. More specifically, this work:

- Analyzes existing DT and DTE literature to derive a comprehensive set of DT requirements.
- Introduces the DTE Logical View outlining the main entities involved and their interrelationships, ensuring alignment with the identified DT requirements.
- Presents the DTE Technological View, mapping DT requirements and DTE entities' responsibilities to appropriate FIWARE components to facilitate practical implementation.
- Defines the *DTE Development View* providing a detailed low-level architectural description applied to a real-world urban mobility case study.

DT Architectures

DT architectures have advanced in recent years, with studies exploring design approaches [6]. Early research, such as [9], focused on defining design patterns for DTbased systems. Building on this, [10] proposed reusable patterns for creating adaptive, autonomous DTs based on microservices, while [2] outlined a roadmap for developing autonomous DTs in digital factories. A complete snapshot of DT architectures highlighted the prevalent use of layered and service-oriented patterns [6].

Agent-based approaches to DT design have also been explored. For example, [4] presented a multiagent DT system framework, while [1] discussed a onedimensional architectural view for collaborative ecosystems. In application-specific research, [3] proposed a DT architecture for healthcare, while [11] adopted FIWARE technology to develop a platform-dependent DT architecture for urban environments. Efforts toward DT standardization are noteworthy: *i*) [12] examined the alignment of manufacturing DT architectures with ISO 23247 standard⁵, stressing the need for standardized reference architectures. [5] proposed a domain-driven design of DT architectures. Interested readers can find a list of additional recommended papers in our GitHub repository ⁶.

DT Requirements

Based on our DT and DTE literature analysis (e.g., [1], [2], [7], [9], [10]), we identified a set of DT requirements describing what a DT must do to achieve its functionalities. Table 1 includes an ID, name, and brief description of each requirement. It also outlines how each requirement maps to the Logical View's entities and to FIWARE components, further discussed in the following two sections.

A DT must accurately represent its PT (R1). This requires (*i*) bidirectional data exchange to establish the closed-loop communication between the PT and the DT (R4), and (*ii*) bidirectional mirroring to ensure that the states of the PT and DT remain continuously aligned (R2).

The DT must store the states and event history (R5) in a context-aware manner (R3), retaining only information relevant to DT operational context. Multiple DTs can be grouped into a composite entity (R6) to form the *Digital Twin Aggregate*, useful for complex real-world systems (e.g., entire cities) that cannot be modeled as monolithic DTs.

DTs should be capable of predicting future behaviors of the PT, which aids in proactive planning and issue anticipation (R7), and adapting to issues affecting both the PT and the DT (R8). Interoperability must be addressed on three levels: i) system interoperability (R9), to enable communication, within the same DT, among different physical systems via suitable interfaces; ii) data interoperability (R10), to facilitate data exchange across various systems and formats; iii) platform interoperability (R11), to allow the extension of DTs with value-added services provided by or built in collaboration with thirdparty entities.

⁵https://www.iso.org/standard/75066.html

⁶https://github.com/alessandrasomma28/

UrbanMobilityDigitalTwin/tree/main/FurtherReadings

ID	Name	Description	Responsible Entity	FIWARE support	FIWARE GE Component
R1	Representativeness	DT must mimic the status and features	DTModel,	×	×
		of the PT.	DTModelManager		
R2	Bidirectional Mirroring	Every status change or event in the PT	DTModelManager,	Р	Context Broker, IoT Agent
		is reflected in the DT, and modifications	Monitoring,		
		in the DT are mirrored in the PT.	Control,		
			DTFeedback, Broker,		
			DigitalAdaptor,		
			PhysicalAdaptor		
R3	Contextualization	DT must manage the PT state and event	DTModelManager,	P	Context Broker, Smart Data
		history considering only PT information	Broker,DataModel		Models
		relevant to the current context.			
R4	Bidirectional Communi-	DT gets data from the PT, and the PT	Broker,	✓	Context Broker, IoT Agent,
	cation	receives DT information after processing.	PhysicalAdaptor,		Kurento RT
			DigitalAdaptor		
R5	Memorization	DT must store all PT relevant data with	DTDataStorage,	Р	Context Broker, Cygnus,
		context and maintain the PT current	DataStorage,		Draco, SIH Comet,
		state.	Broker	_	QuantumLeap
R6	Composability	DT must support grouping multiple DTs	DTModelManger,	Р	Context Broker, Kong
		into a composed entity, providing views	DTService, Broker		
		on both the aggregated and individual			
	-	DIs.		_	
R7	Predictability	DI must simulate PI behavior and inter-	DTService,	Р	Perseo, Wirecloud
		action to determine the outcomes in a	Prediction		
-		likely future.			
R8	Adaptability	DI must provide facilities to address	DTService,	Р	IoT Agent
		and manage damages or issues affecting	Prediction,		
		both the PT and itself.	Optimization,		
			Control,		
			DIFeedback,		
BO	Sustam Interaporability	DT avatam must anoble communice	DigitalAdaptor	P	Contaut Braker
КЭ	System Interoperability	DI system must enable communica-	Broker	P	Context Broker
		within the same DT			
D10	Data Interoporability	DT must oppure data exchange acress	Duckey DeteMed-1		Contaxt Broker Smart Date
		various systems and data formate	BIOKEL, DATAMODEL		Modele
D11	Platform Interaporchility	DT evetom must support the integration	Duchen	(Context Proker
	ration interoperability	of third party value added convices	Broker	✓	
		or trinu-party value-added services.			

TABLE 1. Mapping of DT Requirements to Logical View entities and FIWARE GEs.

DTE Architecture: Logical View

The *DTE Logical View* provides a structural perspective of the DT-enabled Ecosystem. This View models DTE entities and their relations in the *UML class diagram* shown in Figure 1.

In the Logical View, DTE is divided into three subsystems: i) the *Physical Twin Subsystem* (PTS), encompassing the real-world physical assets, ii) the *Digital Twin Subsystem* (DTS), forming the digital core of the DTE; iii) the *Connector Subsystem* (CTS), facilitating data exchange between the DT and its PT, and among multiple DTs.

The PTS includes the actual Physical System and one or more DataProvider and DataReceiver. The DTS includes the DT ecosystem key entities to satisfy DT requirements listed in Table 1:

 DTModel is the virtual representation of the physical system, modeled according to the Composite pattern [13] as it may be built as a composition of multiple models. A Model can be a StructuralModel (e.g., geometrical representation) or a BehavioralModel, describing PT dynamic aspects. The explicit multiplicities highlight that at least one behavioral model is *mandatory* in a DT, enabling the *simulation* execution to mimic PT states (R1).

- 2) DTService represents the services offered by the DTE, leveraging and combining the outcomes of the DTModel. As regards the Operation entity, being a smart system, the DT can perform four basic operations, namely Monitoring and Control (needed for requirement R2), and Optimization and Prediction (for R7 and R8).
- 3) DTModelManager handles the available DT models, managing their creation and exposing their methods to one or more services, according to the *Façade pattern* [13] (requirement R1, R2 and R6).
- 4) DTDataStorage is the repository for preserving (R5) DT-related data, e.g., historical data, domainexpert knowledge, outcomes from services or models execution, etc. Further details about the repository are tied to the kind of data to store, and hence to the investigated domain.
- 5) DTFeedback, provides targeted feedback to the physical system's DataReceiver, either as executable actions or alerts to be further handled by



FIGURE 1. UML Class Diagram of DTE Logical View.

human operators [9] (needed for R2, and R8).

To realize the seamless bidirectional communication characterizing a proper DT, crucial for R2 and R4, the Connector Subsystem has been included. Here, according to the *Adapter pattern* [13], the PhysicalAdaptor acts as a wrapper meant to standardize different, and even unforeseen, data sources into the common interface required by the Broker. Similarly, the DigitalAdaptor homogenizes the interfaces of different data receivers.

The Broker entity has been devised to cope with data interoperability (R10) and data sharing issues typical of a DTE [14], offering a standardized interface and associated information/DataModel (entity, attribute, metadata) for data sharing. Entities' data and metadata are stored in another repository included in the connector itself, namely DataStorage. As DTDataStorage, also DataStorage contributes to requirement R5, but it is meant to store the data exchanged through the Broker. Therefore, it aligns with the specific DataModel used. Conversely, DTDataStorage stores all data generated by DTModels, not necessarily conform to the DataModel. Let us note that the Connector Subsystem enables both

the cooperation and interaction among different models and services, in the case of multiple virtual replicas of the same physical system, and the communication among DTs of different systems (requirements R9 and R11).

The red loop in Fig. 1 highlights the bidirectional communication enabled by the Connector Subsystem. Particularly, data collected and homogenized by the PhysicalAdaptor can be accessed through the Broker by the DTModelManager. The results of the models are exploited to realize different services and feedback, which are provided by the DTFeedback to the DigitalAdaptor, again through the Broker. This enables DataReceivers to trigger novel actions on the physical entities.

DTE Architecture: Technological View powered by FIWARE

The alignment between DTE entities and the FIWARE GEs plays an important role in translating the Logical into the Development View. Table 1 illustrates the extent to which FIWARE components assist in implementing DTE entities fulfilling DT requirements. The symbols X, P, \checkmark indicate whether FIWARE provides no, partial, or

complete technological support, respectively.

As shown in Table 1, FIWARE GEs do not fully meet the *Representativeness* (R1). This requirement demands modeling and simulation tools to execute domain-specific behavioral models, which go beyond FIWARE's capabilities. Partial support arises when FIWARE components cover only some functionalities required for specific DTE entities. For instance, the *Bidirectional Reflection* (R2) necessitates a continuous data flow between Digital and Physical Twins that can be facilitated by FIWARE Context Broker (CB), implementing the Broker class, and the IoT Agents (IoTA), realizing the DigitalAdaptor and PhysicalAdaptor functionalities.

The FIWARE CB, a mandatory element in any "*Powered by FIWARE*" ecosystem, is a publish-subscribe broker managing context information through the Next Generation Service Interfaces (NGSI) protocol. The four different types of brokers (Orion⁷, Orion-LD⁸, Scorpio⁹ and Stellio¹⁰) vary on the NGSI version they implement. IoT Agents enable devices to communicate with the CB using their native protocols (e.g., HTTP or MQTT) and receive information from the broker. This bidirectional data exchange fully supports the *Bidirectional Synchronization* (R4).

Memorization (R5) and *Contextualization* (R3) involve storing state and event data relevant to the current context. Although the FIWARE CB handles only the current state, historical data can be stored using FIWARE GEs such as QuantumLeap¹¹, Cygnus, and others that interface with time-series databases. To ensure data interoperability (R10), the FIWARE CB and Smart Data Models (SDMs) standardize how data are structured in various contexts, facilitating compatibility and data sharing across systems.

For *Predictability* ($\mathbb{R}7$) and *Adaptability* ($\mathbb{R}8$), FI-WARE offers partial support. IoT Agents aid in the implementation of adaptors, while components such as Perseo¹² and WireCloud¹³ enable event processing and visualization. Regarding *Composability* ($\mathbb{R}6$), FIWARE facilitates the grouping of multiple DTs through its Context Broker and Kong¹⁴ offering extended API management capabilities and achieving interoperability at system ($\mathbb{R}9$) and platform ($\mathbb{R}11$) levels.

DTE Architecture: Development View of an Urban Mobility DT

The proposed DTE logical architecture has been instantiated in a small-scale urban mobility case study, considering the Intelligent Transportation System (ITS) of a major Italian city [15]. Implementation details can be found in our GitHub repository¹⁵. The ITS includes buses equipped with Automatic Passenger Counting (APC) systems and GPS devices to collect data on passenger flow and location. These data are processed and integrated into the DT behavioral model, which is executed in the Simulator of Urban MObility¹⁶ (SUMO) to monitor the physical system. FIWARE GEs handle data to ensure interoperability. Additionally, data are utilized by Machine Learning (ML) models to forecast future behaviors. These insights are then applied to DT models to simulate alternative scenarios and optimize the real-world bus network, enhancing service quality and efficiency through a continuous feedback loop. As the data and infrastructure belong to a private company, we will limit the discussion to general information relevant to our narrative without delving into specifics.

Figure 2 depicts the UML Component&Connector diagram of the Development View, outlining DTE components, responsible for implementing entities of the Logical View. The *Physical Twin Subsystem* is represented by the bus vehicles equipped with APC and GPS devices. Since we do not have access to the actual running infrastructure, to simulate the real-time data collection from the PT, we realized a Python script (indicated as simulated physical devices component in the diagram) that mimics data transmission and reception, starting from a real dataset collected on the field.

The *Connector Subsystem* is mainly made of FI-WARE tools and is structured as follows:

- FIWARE Orion-LD is the Context Broker exposing Context Op. API accessed by DataModel Generator and FIWARE Mintaka.
- DataModel Generator is responsible for context modeling leveraging on Smart Cities SDMs, using the Python library named *ngsild-client*¹⁷. More in detail, our scenario consists of {*bus, bustrip, busroute, busstop, APC, GPS*} entities modeled by inheriting and extending SDMs, e.g., "UrbanMobility".

⁷https://fiware-orion.readthedocs.io/

⁸https://github.com/FIWARE/context.Orion-LD

⁹https://scorpio.readthedocs.io/en/latest/

¹⁰https://stellio.readthedocs.io/en/latest/

¹¹https://quantumleap.readthedocs.io/

¹²https://fiware-perseo-fe.readthedocs.io/

¹³ https://wirecloud.readthedocs.io/

¹⁴ https://github.com/FIWARE/kong-plugins-fiware

¹⁵https://github.com/alessandrasomma28/ UrbanMobilityDigitalTwin

¹⁶https://eclipse.dev/sumo/

¹⁷https://ngsildclient.readthedocs.io/



FIGURE 2. UML Component&Connector of DTE Development View.

- MongoDB is used by the CB to store context data and by the IoT Agent to hold device information (e.g., device authentication keys).
- FIWARE Mintaka exposes the Temporal Op interface and is responsible for persisting historic context in TimescaleDB through T-CRUD Op API.
- FIWARE IOT Agent JSON is the NGSI Linked Data (LD) adapter receiving and adapting both data flow from the physical devices (*northbound* traffic) and commands coming from the CB (*southbound* traffic). Hence, in our case study, it realizes both PhysicalAdaptor and DigitalAdaptor.

The core of the architecture is the *Digital Twin Subsystem*, where the DTModel is composed of two behavioral models. On one hand, the open source microscopic and multi-modal traffic Simulator of Urban MObility simulates different urban scenarios considering both private and public traffic. Starting from origin-destination matrices, public transit scheduling data (in the GTFS format) and OpenStreetMap networks, we simulate weekday and weekend scenarios, allowing the evaluation of novel policies for traffic and/or public transport management. Moreover, we simulate anomaly situations such as events, disruptions, or strikes, to understand the impact of such situations on traffic and passenger flow, and the effectiveness of different policies.

On the other hand, Bus Passenger Demand AI Model is a three-layer Long Short Term Memory (LSTM) network realized with Tensorflow. It enables the prediction of passenger demand for future timestamps, based on historical or simulated data. Both DT models receive the PT northbound traffic by the *providing port* of DTModel Manager and send their outcomes on its *receiving port*. Additionally, they can retrieve or provide data directly by invoking Mintaka API.

The DTModel Manager exposes Scenario Simulation Prediction Generation and functionalities to the DT Service, for triggering the respective components. This chain enables the Simulation Service and bus passenger demand Prediction Service. The advantage of DT is that predictions can be further used to simulate alternative scenarios and make decisions, e.g., bus rerouting. Please note that, in our case study, the DTFeedback is included in DT Service and is the bus re-scheduling suggestion to human operators, sent on PT receiving port, via the IoT Agent. The other two DT services are the Visualization of PT and DT data and the Monitoring of PT states through its virtual

replica. They are implemented through Grafana¹⁸, open source analytics and interactive visualization multi-platform. DT Service outcomes can be directly stored in TimescaleDB or accessed through Mintaka.

Discussion

We demonstrated how the DTE Development View for a small urban mobility scenario effectively implements the DTE entities from the Logical View. Despite the simplicity of our case study, the DT requirements are met through the integration of the SUMO simulator for behavioral modeling and FIWARE GEs for data management.

The multi-view architecture's strength lies in its flexibility and domain-agnostic design. With its modular structure, the DTE can efficiently be extended to integrate other aspects of urban scenarios, e.g., Weather DTs, Building DTs. Moreover, the Logical View can be applied in various domains with minimal changes. For instance, transitioning from urban mobility to other sectors would require only minor adjustments, such as adapting the DT model, and choosing a suitable simulator and FIWARE Smart Data Models.

FIWARE GEs ensure robust data and system interoperability, with APIs for seamless interaction between Context Broker and other services, such as Apache¹⁹. Moreover, the FIWARE Orion-LD Broker supports scaling with growing data volumes, while the IoT Agent facilitates adaptation to new data sources without custom adaptors.

Though theoretically capable of integrating diverse devices and data sources, our case study involves a limited number of entities. As the system scales, challenges in communication, storage, or processing may arise, particularly with increased demands on behavioral models. Additionally, heavy reliance on FIWARE introduces a dependency where future updates could impact performance and stability. To mitigate this, we use a modular approach to FIWARE components, allowing easier updates and reducing the risk of obsolescence.

Conclusion and Future Work

In this paper, we addressed the problem of what a DTenabled ecosystem is and how it can be implemented, by focusing on the different Architectural Views and by providing a technological mapping with FIWARE. Future work will focus on refining the general proposal by improving the multi-view architecture and validating its versatility across various domains. We plan to apply the DTE Logical View to other sectors (e.g., environmental monitoring) to showcase its domainagnostic nature. For the urban mobility case study, we will perform large-scale scalability tests, optimize data transmission and storage, and explore distributed or cloud-based solutions. Finally, we will address security and privacy concerns using FIWARE tools like Keyrock²⁰ in both the Logical and Development Views.

Acknowledgments

This work has been partially supported by the *Hitachi Rail* company, which provided us valuable domain expertise, and by the Spoke 9 *Digital Society & Smart Cities* of ICSC - Centro Nazionale di Ricerca in High-Performance-Computing, Big Data and Quantum Computing, funded by European Union - NextGenerationEU (PNRR-HPC, CUP: E63C22000980007).

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