On the use of sociotechnical systems design in industry: digital transformation processes and artifacts

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Abstract

Digital transformation is a broad description of efforts to introduce new technologies within and across organizations with the potential to revolutionize the way they function and perform. Digital transformation may be addressed at multiple levels of analysis, and this paper focuses on the enterprise level. This includes the organization, its people, systems, tools and technologies, and suppliers and partners that combined create valued outcomes that sustain the enterprise and advance its objectives. Collectively, this is a complex sociotechnical system (STS), and digital transformation is an intervention in a STS of potentially profound scope. Classical STS theory emerged from analysis of individuals and work groups and principles have been defined for the design of work systems at that level. We explore how STS design principles may be applied to the enterprise-level challenges associated with digital transformation. We present an enterprise-level framework that describes a process and methods that are consistent with STS design principles and illustrates how existing systems analysis methods and artifacts may be used to design an enterprise level STS. We review some artifacts employed in digital transformation efforts, including enterprise reference architectures, to better understand how they might function as means to foster communication and collaboration across multiple disciplines and domains in the STS design process.

Keywords

Digital Transformation, Sociotechnical System Design, Enterprise Architecture, Reference Architecture, Boundary Objects

1. Introduction

Digital transformation encompasses the transformation of organizations and their structures, processes, relationships, and behaviors and is largely driven by the development and growth of enabling digital technologies. As a phenomenon, it has already been underway for some decades, but the introduction of new technologies and near-continuous changes and improvements to existing technologies suggests that organizations will face the prospect of ongoing redesign for some time to come. With the influx of new digital technologies, new behaviors and capability sets will emerge within organizations, whether by design or by necessity. One thing is certain, however: the introduction of new digital technologies and the technologies of organizations, but will also change their social structures and dynamics.

The understanding of the interplay of social and technical systems (or sociotechnical systems, STS) has developed over several decades, starting with seminal works in the 1950s. Much of the development of STS theory has focused at the individual and group levels and their interaction with specific technologies. More recently, STS theory has started to address more aggregated levels of analysis—the organization and enterprise—with promising results. The importance of studying sociotechnical

$$\label{eq:expectation} \begin{split} & EMAIL: \underline{erebenti@mit.edu; antonio.l.soares@inesctec.pt; rhodes@mit.edu; ricardo.a.zimmermann@inesctec.pt; jcardoso@mit.edu} \\ & \underline{ORCID: 0000-0003-1124-1312; 0000-0001-7654-1397; 0000-0002-5868-8982; 0000-0002-3398-7134} \end{split}$$



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systems at the enterprise level has long been recognized. Trist, in a 1959 lecture, asserted that the relationships of social systems and technology "can be studied at any level: that of the individual, the primary work group, larger internal units involving various levels of management, and the enterprise as a whole." [1]. Legacy studies of large enterprises typically focused on the social systems rather than the sociotechnical. Rouse et al. [2] discuss the evolution of STS from origins to contemporary views, and the implications of growing social complexity. Currently, the characterization of STS principles and practices at the organization or enterprise level is still in its early days. There is much that we don't know about how STS principles and practices can be applied to the design of organizational systems at higher levels of aggregation.

When new technologies are introduced into organizations, the human/social system often adapts to accommodate and appropriate the benefits of the new technical capabilities. However, this can often be a lengthy and disruptive process, and not always successful, especially when done in an ad-hoc manner. Enterprise Architectures (EA) result from a deliberate, structured approach that seeks to characterize how new capabilities relate to one another with an enterprise-wide perspective. EA ideally encompass all relevant facets of the organization, transcending traditional information technology (IT)-centric views in order to better respond to increasingly complex environments [3]. Adding additional challenge to the STS designer is the near-constant pace of change in enabling information technologies. Pasmore et al. [4] assert that a sociotechnical system should strive for "continuous design" instead of episodic design in the development of new capabilities in order to better cope with continuous change.

In addition to social and technical aspects of digital transformation, the STS may involve a large number of elements and connections, with corresponding diversity in disciplines and domain expertise required. Collaborating in the design of the new STS requires the ability to represent and share multiple perspectives through artifacts functioning as boundary objects that facilitate understanding and knowledge transformation [5]. Previous research focusing on the introduction of digital twins into a STS used the concept of operations (CONOP) as an artifact that explicitly translates strategic decisions into sociotechnical systems vision, goals, concepts and high-level requirements, bridging the strategic process with enterprise architecting and STS design activities [6]. This paper seeks to identify other possible artifacts that can support and enable STS design by acting in the role of boundary objects.

The architecting of IT systems increasingly includes the use of reference architectures (RAs). RAs describe the expected functions and capabilities typical to a digital enterprise. A closer look at existing RAs suggests that they express greater detail concerning technical capabilities than of the social capabilities in the digital enterprise. As such, they may provide some benefit to STS design, but may not sufficiently address the spectrum of social and technical challenges likely to be encountered.

In this paper, we explore whether the development of new organizational capabilities enabled by digital technologies can be made a more deliberate and systematic process, in which the benefits are realized more quickly and with less disruption to on-going operations. More specifically, we are interested in exploring how STS design principles can be applied to the design of digital-enabled organizations such that the creation and employment of new capabilities is less disruptive and the likelihood of overall success increases. We further investigate whether RAs or similar EA artifacts could be useful to bridge between the IT, managerial, and other communities of practice in the STS design process for a digital-enabled enterprise. We start with these questions:

- Can enterprise-level perspectives and techniques be combined with existing STS design theory, principles, and practices to help with the transformation of modern digital-enabled enterprises?
- Do existing enterprise architecting artifacts, such as reference architectures, better enable a STSoriented approach to digital transformation?
- Is a multiple disciplinary perspective enhanced during the STS design of digital-enabled enterprises by the use of system artifacts functioning in the role of boundary objects?

2. Sociotechnical systems implications for digital transformation

In addition to the increasing dynamism and complexity of current business environments, technologies themselves are changing and becoming more complex, requiring new approaches to design and implementation processes. While initial discussions about digital transformation focused mainly on technical dimensions, there is a gradual and increasing recognition of the relevance of human and

organizational aspects in this process [7]. In this paper, we adopt a definition of Digital Transformation as "[...] the process of organizational or societal changes driven by innovations and developments of ICT [information and communications technology]. It includes the ability to adopt technologies rapidly and affects social as well as technical elements of business models, processes, products and the organizational structure" [8]. Digital transformation includes the design, development and implementation of technology-intensive work systems, as well as the required organizational change process. In this sense, successful digital transformation includes the combination of technical systems (adoption of digital technologies) and social systems (organizational practices and human factors) with the objective of enabling business and performance gains [9], [10].

In addition to technological development and implementation, digital transformation presents challenges in the operational, organizational and managerial levels [11], [12] and its boundaries are defined by a systems perspective and by the principles of open systems [9]. The social dimension of a sociotechnical system focuses on aspects such as people, relationships, organizations and performance, while the technical dimension includes technology, innovation, knowledge, processes, and methods [13]. The adoption of a systems approach to the design and implementation of digital technologies will necessarily include organizational changes. This approach encompasses the dependencies between all the components of the sociotechnical system and commits to the idea that the different aspects must not be analyzed separately.

According to [14], "digitalization is about leveraging digital technology to alter socio-technical structures". The introduction of digital technologies represents sociotechnical interventions that have impact on several working and organizational aspects such as: organizational structure; production systems and operating procedures; communication and collaboration; job profile, skills and the abilities required to perform the work; climate, culture and strategy [15], [16]. Thus, social and technical elements must be considered in the process of digital transformation. The sociotechnical design perspective has begun to co-evolve in response to the increasing adoption of digital technologies [4]. The sociotechnical systems design cycle becomes iterative with trades made between the different system elements and relationships until the sociotechnical systems design converges on a higher-performing system architecture.

Although digital transformation may be addressed at multiple levels of analysis, systems designers must recognize that systems boundaries are usually permeable, permitting interactions with the environment. The traditional level of analysis (usually the company or the team) does not consider all the relationships and the myriad of elements that influence and are influenced by the implementation of a new technology. In this scenario, there may be a mismatch between the analysis carried out by the systems designers and the reality, considerably more complex.

The enterprise level of analysis includes the organization, its people, systems, tools and technologies, and suppliers and partners that combined create valued outcomes that sustain the enterprise and advance its objectives. In this organization's larger enterprise context, the partners, suppliers, and other stakeholders may contribute/consume resources or provide capabilities, and may value or otherwise benefit from outcomes. Therefore, the organization develops its strategy in response to the ecosystem in which it resides, and typically evolves that strategy based on how well its outcomes suit the environment in which it operates [6]. Enterprise architecting extends the description of system elements beyond the core organization and includes additional perspectives to more fully encompass the elements and their relationships.

A step further in terms of the level of analysis to the systems design process is to consider an even wider sphere of mutual influence of the organization. The enterprise value chain includes the flow of goods, money, information and knowledge between individuals, organizations, resources and activities (internally and externally) with the goal of delivering value to the end user. Beyond its value chain, an organization influences and is influenced, in a greater or lesser extent, by the environment around it, including society and the natural world. In this sense, the adoption of a new technology also has the potential to impact and be impacted by these elements. Moreover, as digital transformation potentially enables companies to improve efficiency and resource management, it also theoretically improves sustainable performance, both economically and environmentally [17].

A system design considers the complexity of a sociotechnical systems in a broad level perspective covering aspects such as: (1) Active involvement of relevant stakeholders (internal and external) across the organization's value chain; (2) Identification of system boundaries and definition of performance

criteria – allowing the definition of the systems parameters; (3) Clear knowledge on the current situation (as is), including the assessment of technological and organizational aspects related to structure (e.g. number of hierarchical levels), job profile and competences; (4) Analysis of the necessary changes "as a condition" and the expected "changes as a consequence" of the technology implementation – considering aspects such as technology, people, infrastructure, processes, culture and strategies; and (5) Analysis on how the adoption of a new technology can impact and be impacted by social and environmental aspects.

3. A framework for sociotechnical system design

A sociotechnical system design approach benefits from the application of existing tools and analysis methods to define both high-level and detailed elements, relationships, and processes in the enterprise, encompassing both social and technical aspects. Importantly, this enables evaluation and tradeoff between social and technical system elements that characterizes the actions, interactions, and roles of each.

Bartezzaghia et al. [18] in a study of Industry 4.0 technology adoption in three organizations describe the STS design effort as a continuous, participatory, learning process, where planning and doing are contemporaneous. They describe three methods used in STS design that: 1) ensure that design choices are simultaneously considered from multiple domains; 2) are based on continuous experimentation and iteration; and 3) actively involve a broad set of stakeholders. Imanghaliyeva et al. [19] define a list of 20 STS design principles based on a systematic literature review. Among the STS principles mentioned are joint optimization, participation, experimentation, responsibility, boundaries, multidisciplinarity, functional purposes, and simplicity and scale.

While helpful, principles must be operationalized into methods and processes to be successfully employed in digital transformation efforts. Rebentisch et al. [6] developed a STS framework for organizational design, which is adapted and presented in Figure 1. The framework defines a sequence of cycles employing specific, existing system analysis methods in a way that operationalizes STS design principles. The major cycles of activity are requirements, sociotechnical systems design, and implementation. The framework connects enterprise strategy to implementation, so its scope exceeds just the design of the STS, but is consistent with the principles of STS design mentioned in the literature.

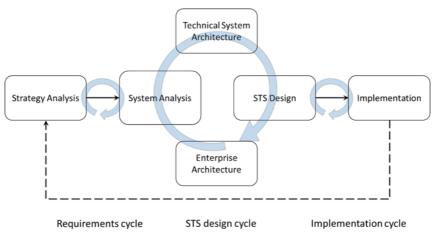


Figure 1: Digital transformation framework highlighting STS Design activities (figure adapted from [6]).

The three main cycles of the framework include these elements:

- The Requirements cycle identifies stakeholder and other needs in the enterprise, and elements of strategy that may be addressed through capabilities enabled by digital transformation. The artifacts created during system analysis include a concept of operations (CONOP), use cases and operating scenarios, and system requirements [6].
- The STS Design cycle collects artifacts that describe the relevant aspects and attributes of the STS and synthesizes them into a design that can be implemented. The artifacts used during this

cycle include candidate technical system architecture elements (e.g., IT architecture(s)), candidate enterprise architecture elements, and artifacts from the Requirements cycle. The design of the STS emerges through a highly iterative, collaborative process where the different elements are fashioned into an STS enterprise design using system architecting methods (e.g., allocating functions to forms in an iterative manner; see [20]). The STS design cycle requires the greatest degree of interaction across domains and knowledge boundaries given the scope of information associated with creating an enterprise-level STS design.

• The Implementation cycle partitions the STS design into discrete implementation projects and manages the implementation process through the execution of these projects. The primary artifacts in this cycle are the project plans and overall roadmap to implementation.

As the framework depicted in Figure 1 is based on systems analysis and engineering concepts, many of the artifacts are drawn from systems engineering methods. The CONOP charts a path from strategic goals or objectives to the operational capabilities needed to accomplish those objectives, and its authors would include senior management, other stakeholders, and systems analysts. The technical architecture is a system architecture description of the technical elements of the system that includes a decomposition of technical elements and their interactions to actionable levels of detail. For a digital system, it would generally be produced by IT architects and would potentially represent technical architecture options through multiple levels of decomposition. The EA describes the candidate elements of the enterprise and relationships between them. An enterprise reference architecture is a generalized description of an EA. The artifacts associated with the technical architecture and EA may be formally-or informally-defined, but exist nevertheless, and are used as inputs to the STS design process (if they are not already formally-defined, they will likely be discovered and perhaps documented through collaboration during the STS design).

The synthesis of the STS through the process shown in Figure 1 reflects the principles of STS design, including engaging multiple stakeholders and domains, joint optimization of social and technical elements, challenging existing boundaries, multidisciplinarity, and driving the STS design from functional objectives. The effectiveness of the application of these principles will depend on the likelihood that the artifacts employed in the process enable meaningful collaboration across different perspectives. If the artifact representing the technical architecture, for instance, is understandable only to the IT architect, the managerial staff or other stakeholders may not be able to identify organizational processes, resources, or relationships that must be co-designed with the new technical approach. A lack of accessible and understandable artifacts in any part of the STS design cycle may inhibit the ability to correctly allocate functions to solutions across domain boundaries or jointly optimize the overall configuration of the STS design.

Boundary objects possess the attributes that enable them to foster communication and joint problemsolving between different groups and across knowledge boundaries. A question for the STS designer is whether the artifacts being used (e.g., the CONOP, technical architecture, etc.) possess the necessary attributes to enable them to function as boundary objects. In the next section, we examine whether enterprise architectures (and specifically reference architectures) as they currently are employed can function as effective boundary objects during STS design.

4. Architectural artifacts and their potential role in STS design

The concept of Enterprise Architecture (EA) goes back to the 1980s [21] while the industry specific manifestations of it appeared in the 1990s with research initiatives across Europe and the US [22], [23]. EA are conceptual artifacts that are used in a range of management activities, mostly addressing the planning and use of information technology and systems. Enterprise architecture management (EAM) aims to purposefully design an enterprise's architecture to enhance its pursuit of its strategic goals [24]. At its most basic level, an "architecture" describes a system's fundamental structure, and provides guidelines for its evolution [29]. It describes the fundamental organization of a system's components, their relationships to each other, and to the environment.

EA can be seen as a process (architecting) - a manifestation or enactment of strategic, tactical, and operational decisions regarding processes, organization, technology, and people – or as a set of articulated descriptive and prescriptive artifacts – principles, guidelines, models – providing support to

the management of an enterprise. While EA as a process is continuously evolving, EA as an artifact is not adaptive to cope with complex, continuously changing environments [3]. Nevertheless, EA artifacts such as Reference Architectures (RA) have been increasingly adopted since at least two decades by industrial companies and organizations as a blueprint for building and interoperating their software-intensive, cyber-physical systems [25].

But to what extent is EA consequential to STS design? Extant literature is scarce in respect to the use of structural (conceptual) representations of the enterprise that include some facet of a sociotechnical perspective. For example, Fayoumi et al. [26] address the design of explicit sociotechnical constructs within an Enterprise Modeling approach. This type of research outcome, resulting from a blank sheet approach, is challenging because of a usually long knowledge transfer process and adoption into practice. In a stream of research addressing EA beyond IT and enterprise organizing and transforming processes, Korhonen and colleagues start by proposing that enterprise architectural work (possibly involving EA) be divided into three distinct yet interlinked architectures: technical, sociotechnical and ecosystemic [27]. Later, they propose an adaptive EA to cope with the complexity of enterprise in ecosystems, drawing on the heritage of "Open Sociotechnical Systems design" [3]. Finally, they question the implications of digital transformation on EA, again using the three interlinked architectures mentioned above [28]. This stream of research points to the possibility of using EA and their artifacts with a potential mediating role in STS design processes.

4.1. Reference architectures as boundary objects in STS design

In the last decade, in particular with the rise of the Industry 4.0 concept and associated technologies, the concept of "Reference Architecture" has gained traction across several industrial areas. Cloutier et al., [30] define Reference Architectures (RA) as capturing "the essence of existing architectures, and the vision of future needs and evolution to provide guidance to assist in developing new system architectures". Ideally, an RA should address the technical architecture, the business architecture, and the customer context [30]. Two main principles should be considered when designing or using an RA: (i) an RA is an elaboration of company (or consortium) mission, vision, and strategy; it facilitates a shared understanding across multiple products, organizations, and disciplines about the current architecture and the vision on the future direction; (ii) an RA is based on concepts proven in practice [30]. A reference architecture provides a common framework around which more detailed discussions can center, enabling the comprehension of the most important high-level aspects and providing a structural guide for systems design, without the encumbrance of unnecessary and arbitrary details or restrictions [31]. Last, but not the least, RAs are the result of negotiation and consensus within reputed business and professional (and academic, to a lesser extent) communities, thus having some authoritative influence with practitioners.

Previous research concluded that EA artifacts can act as instruments for information sharing, highlighting dependencies and supporting the coordination of enterprise transformation. However, in practice, EA artifacts often fail to be used by communities other than IT to communicate [24]. Kotusev and Kurnia [32] conclude that EA can work as boundary objects and be meaningful to diverse communities of practice, facilitating communication and understanding. However, they view EA artifacts as boundary objects mostly between business and IT communities, not necessarily embracing STS design. This raises important questions regarding their desirable informational content and other related properties boundary objects could beneficially exhibit within STS design. At present, no empirical analysis of EA artifacts from the perspective of their informational content and respective boundary objects to derive hypotheses for the design of EA artifacts, with the goal of supporting communication and coordination in enterprise transformation projects. We build on these results to analyze the instrumental potential of industry-specific EA artifacts (e.g., Industry 4.0 Reference Architectures - i4.0-RA) in digital enterprise transformation processes, from the perspective of STS.

Boundary objects are abstract or physical artifacts that support knowledge sharing and coordination between different communities of practice by providing interfaces. This concept was first introduced by Star and Griesemer [33] and since then interpreted, adapted, and appropriated by other researchers in various scientific areas. Two central aspects have been common to the use of the BO concept: interpretive flexibility and retaining the community's identity [24]. The notion of boundary objects identifies the types of representations that have "different meanings in different social worlds but their structure is common enough to more than one world to make them recognizable as a means of translation" [33]. Effective boundary objects "do not need to be accurate to be useful" [34], as long as they enable people to share knowledge and find common ground. Boundary objects contain sufficient detail to be understandable by both parties, but at the same time, neither party understands the full context of use by the other [33].

From the properties identified by [24] we selected Abstraction, Shared syntax/semantics (added), Malleability, Stability, and Visualization as the relevant properties to analyze the potential contributions of RAs to the STS design process. For the STS conceptualization, the STS conceptual elements described in [6] - Strategy, Ecosystem, Organization, Resources, Capabilities, Social system, Stakeholders, Outcomes – were used in combination with the Levels of STS Design from [4] – Strategic design (purpose, governance, ecosystem, organization), Operating system design (technology, social system), and Work design (projects, expertise, processes). This conceptual framework is represented in Figure 2. We use this conceptual framework to evaluate RAs as potentially useful artifacts in the STS design process.

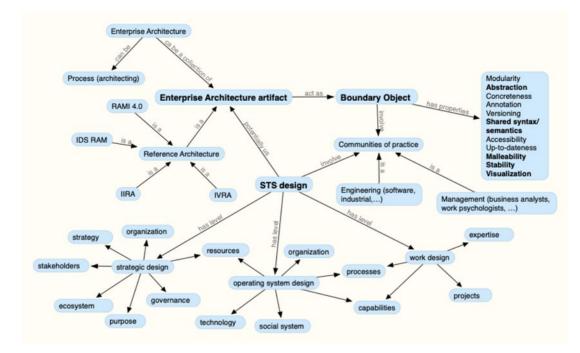


Figure 2: Conceptual framework for analyzing the potential of RAs in STS design.

4.2. The potential role of industrial Reference Architectures in STS design

Why do we hypothesize that a RA is a potentially useful instrument in STS design processes? Uslar and Hanna [35], on describing their approach to a visualization for RAMI 4.0 (Reference Architectural Model Industrie 4.0), briefly discuss the adaptation process of RAMI 4.0 from the earlier SGAM (Smart Grid Architecture Model). Although this discussion is at the business/technical requirements level, it shows the possibility of this specific RA to act as a boundary object between two business/technical communities – industry/manufacturing and energy/smart grids – although these communities are disciplinarily close in theory and practice. Panarotto et al. [36] point to the need to rely on the ability of stakeholders to develop shared meaning when using models as boundary objects in early design negotiations. Although [36] analyzed mostly computational models (while we are analyzing the use of conceptual models) the study highlighted the importance of taking a boundary object perspective in the development of a collaborative decision support system. We consider STS design as an example of collaborative decision process. Another relevant conclusion from [36] is the need for increasing the

flexibility of information exchange between modeling domains and the development of a 'metamodel' boundary object which enables negotiation about the information requirements for a certain decision to be made. This meta-model role could potentially be assumed by a RA.

The EA artifacts analyzed in this paper are RAMI 4.0 (Reference Architectural Model Industrie 4.0), IIRA (Industrial Internet Reference Architecture), IVRA (Industrial Value Chain Reference Architecture) and IDS-RAM (International Data Spaces – Reference Architecture Model 3.0) (see Figure 3). RAMI 4.01 (Reference Architectural Model Industrie 4.0) is a domain-specific, government-driven architecture resulting from the Platform Industrie 4.0 initiative of the German government and widely adopted in the EU. It is also the international technical specification IEC PAS 63088:2017. IIRA (Industrial Internet Reference Architecture) is a domain-independent, industry-driven architecture that includes manufacturing, healthcare, energy, smart city, and others, and has been developed by the US-led IIC-Industrial Internet Consortium, a program of the Object Management Group (OMG). IVRA (Industrial Value Chain Reference Architecture) is a conceptual architecture maintained by the Industrial Value Chain Initiative in Japan. IDS-RAM (International Data Spaces – Reference Architecture Model 3.0) is a virtual data space, based on existing standards, technologies, and data economy accepted governance models, aimed to facilitate secure and standardized data exchange and linkage in a trusted business ecosystem. It is promoted and managed by the International Data Spaces Association, a non-profit organization. Basic visual models of these RAs are shown in Figure 3.

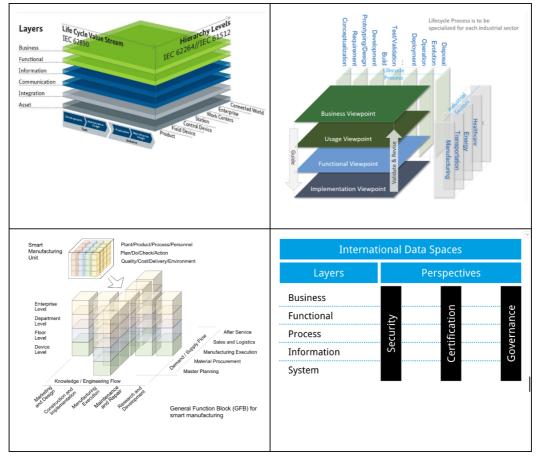


Figure 3: The four reference architectures analyzed (left-right, top-down): RAMI4.0, IIRA, IVRA and IDS-RAM3.0.

This analysis is based on the upper-level STS design ontology depicted in the conceptual framework of Figure 2. Enterprise Architecture and boundary objects fundamental concepts were linked to this ontology. This is mostly a terminological/conceptual analysis where we try to align the concepts in the i4.0-RA to the concepts in the STS design ontology. From this terminological/conceptual analysis, essentially along the Shared syntax/semantics property, we inductively characterize the remaining properties.

The four RAs have some common structural properties. They use architecture viewpoints and views to frame and address the various interests (concerns) that stakeholders in the system may have. In RAMI4.0, IIRA and IVRA the viewpoints are visualized through a tridimensional space metaphor. The IDS RAM3.0 high-level structure is two-dimensional.

The RAMI4.0 documentation does not go into detail beyond the overall tridimensional structure, thus our analysis is inconclusive regarding the alignment of concepts. At such a high level, particularly the Levels viewpoint can be aligned with any of the STS design concepts, although substantial interpretation and explanation would be needed.

The IIRA description is much more detailed in conceptual terms. The Business, Usage, Functional and Implementation viewpoints unfold into specific concepts: Business - Visions, Values, Key Objectives, Fundamental Capabilities, Stakeholders; Usage - System, Activity, Task, Role, Party; Functional - Domains (Business, Operations, Information, Application, Control); Implementation - Architecture Patterns. These concepts are generic enough to align with the STS Strategic design level. It is relevant to note that IIRA describes the "human role" for the domains in the Functional viewpoint. This enables the alignment with the Operating System and Work STS design level concepts.

IVRA is structurally more complex as it proposes a Smart Manufacturing Unit tridimensional model (Asset, Activity, and Management) to be "encased" in the more general, also tridimensional "General Function Block for Smart Manufacturing". The three viewpoints are: Level (Enterprise, Department, Floor, and Device), Knowledge/Engineering Flow (life-cycle) and Demand/Supply Flow (Planning, Procurement, Manufacturing Execution, Sales and Logistics, After Service). While the latter are generic enough to align with the STS Strategic Design level, the Asset, Activity and Management views of the former are able to align with Operating System and Work STS design levels' concepts.

From the four RAs analyzed, IDS-RAM3.0 is the more infrastructure-oriented and thus the least human-oriented in conceptual terms. Nevertheless, the viewpoints (Layers) Business, Functional, Process, Information, System use some concepts related with organizational structure, roles and relationships that can (loosely) align with the Operating System STS design: User, Consumer, Broker, Identity, Exchange, Contract, Trust, Sovereignty. Finally, the conceptual representation of a digital resource in this RA proposes a concern-basic description including Content, Concept, Community of Trust, Commodity, Communication, Context that can (again, loosely) be aligned with the Operating System STS design. Table 1 summarizes these findings.

Table 1

	Abstraction (higher)	Shared syntax/semantics	Malleability	Stability	Visualization
RAMI 4.0	Layers, lifecycle value stream and hierarchy levels are high-level concepts (perhaps too high) that can generically be integrated with the levels of STS design.	While the Business, Functional, Information, Communication, Integration, and Asset layers can be easily shared, the lack of conceptual details and modeling tools descriptions limits building shared meanings.	The high conceptual level enables adaptation and transformation, but the effort to do so would be substantial.	The origin and nature of the RA makes it relatively stable over time.	The 3D space metaphor together with a layered structure provides a familiar recognition of views and concerns.

Boundary Object property analysis of ERA frameworks

IIRA	Viewpoints (concerns, views, models), lifecycle process, industrial sectors are high-level concepts (perhaps too high) that can generically be integrated with the levels of STS design.	Business, Usage, Functional and Implementation viewpoints give enough latitude to accommodate STS design. Model types are technically-oriented thus may be more challenging to develop shared meaning.	The level of conceptual detail and a number of concepts similar to the STS design concepts potentially enables cost effective adaptation and transformation.	The origin and nature of the RA makes it relatively stable over time.	The 3D space metaphor together with a layered structure provides a familiar recognition of views and concerns.
IVRA	Levels, engineering/knowledge flow, demand/supply flow are high-level concepts (perhaps too high) that can generically be integrated with the levels of STS design.	Enterprise, Department, Floor, Device levels are not general enough to accommodate all the STS design concepts. However, the Asset, Activity, and Management views on Smart Manufacturing Units can be useful in the STS detailed design.	The level of conceptual detail and a number of concepts similar to the STS design concepts potentially enables cost effective adaptation and transformation.	The origin and nature of the RA makes it relatively stable over time.	The 3D space metaphor together with a layered structure provides a familiar recognition of views and concerns. However, this RA is structurally more complex, which can cause difficulties in visualization.
IDS- RAM	Layers, perspectives are high-level concepts (perhaps too high) that can generically be integrated with the levels of STS design.	While Business, Functional, Process, Information, System, layers can be easily shared, Security, Certification, and Governance are difficult to be related with the STS design concepts.	The infrastructure orientation doesn't give much space for transformation and adaptation.	The origin and nature of the RA makes it relatively stable over time.	The relatively simpler visual representations are not as effective as the ones from the other RAs.

Abstraction – high-level view, hiding local contingencies, highlighting communalities.

Shared syntax/semantics – common information models, shared notation conventions, uniform local use of information objects across communities of practice.

Malleability – joint transformation and adaptation of constructs, agreements on parts of models to suit communities' areas of concern.

Stability – information objects stable over time, despite local uses, stable reference frames.

Visualization - graphical or physical representations, interpretive flexibility, and cognitive effectiveness.

5. Discussion and conclusions

This paper described digital transformation as an enterprise-level example of a STS design exercise. It presented a framework for describing the context in which STS design occurs – embedded within a transformation process that includes requirements, STS design, and implementation cycles. The artifacts produced during these cycles are instrumental in the design of the STS. Their effectiveness in part depends on their ability to foster communication, collaboration, and synthesis of implementable designs, consistent with principles of STS design and the attributes of effective boundary objects.

We proposed a role for reference architectures as potentially useful artifacts in digital transformation using an STS design approach. The idea is that RAs could function as boundary objects between different stakeholders in the STS to enable them to balance and optimize the allocation of functions across the social and technical elements of the digitally-transformed enterprise.

The results of the terminological/conceptual analysis of four representative RAs are inconclusive. For the moment we are not able to definitively answer the question of whether RAs can be useful boundary objects and potential tools to support a STS design process for digital transformation. A summary of the insights gained from the review provides these observations by the respective boundary object properties:

- Abstraction: The RAs in general are high-level abstractions that can be mapped to some (but not all) STS design elements. However, the usefulness of RAs as boundary objects is questionable from an abstraction perspective given the high-level at which they are currently described. Useful STS design will likely need to take place at more detailed-granular levels of abstraction that are closer to the actual value-creating activities. The current RAs may therefore be useful to frame the scope of the STS design discussions, but may not provide substantive content for STS design itself.
- Shared syntax/semantics: Each of the RAs have areas of strength and weakness with respect to STS syntax and semantics, depending on what areas they emphasize. Overall alignment with the conceptual framework for STS design is uneven, however. Perhaps STS-oriented guidance from the conceptual framework could be used in the definition of RAs to help them to be more useful as boundary objects in STS design.
- **Malleability**: RAs with greater existing overlap with the attributes in the conceptual framework for STS design may potentially require less effort to adapt to serve as effective BOs. Some RAs do not have as much overlap with the STS design attributes and the effort required to adapt them to be more effective boundary objects could be substantial.
- **Stability**: All RAs demonstrate stability
- Visualization: Most of the RAs are effective at visualizing the dimensions

In summary, the RAs that were examined are weakest in the areas of abstraction (lack of concreteness, limited coverage), shared syntax (limited coverage), and malleability (higher cost to adapt a RA that lacks the necessary attributes). The RAs are strongest in stability and visualization, although these may not necessarily be the most consequential of the BO attributes. A common theme among the weaknesses involve limited alignment with STS design conceptual framework and overly-high level of abstraction. This suggests that the STS design conceptual framework could potentially evolve to serve as an input to the definition of RAs to enable them to be more effective artifacts in the STS design process.

This analysis of RAs as boundary objects was made at a high abstraction level using documentation that is openly available. Without perspective on the application of these RAs in practice, it is questionable whether this analysis is suitable for deriving relevant implications for practice. This is not a surprising result. RAs most likely weren't defined with the STS design use case in mind. They are descriptive representations of system properties from different viewpoints. The ability to function as useful boundary objects were not necessarily a priority in their original definition (i.e., they are conceptually understandable, but not consequential at the level of making architecture decisions, tradeoffs, and designing solutions). RAs are however malleable artifacts and currently have reputational advantage among practitioners. This means that they may be the most effective way to engage in continuous STS design for digital transformation, if they can be tailored to include STS design element artifacts.

From a theoretical perspective, we believe this analysis paves the way for a more detailed study on the role of RA in STS design. Specifically, this analysis is based on reference documents, which are by nature generic descriptions that enable them to apply across a range of application domains. Moreover, architecture models themselves are descriptive rather than specific in their characterizations of the STS. Useful boundary objects are situated between domains in a specific context, and thus depend on enough detail to enable consequential sharing across the boundary. This suggests that to fully explore the potential benefits of using RAs as artifacts in STS design will require empirical investigation, which could address these points:

• Our analysis assumes that RAs are employed by enterprises for design actions leading to digital transformation, and can be used in that role as effective BOs. However, this role should be investigated empirically to confirm that in fact RAs are being used as assumed, and to verify that

the existing intent is to employ them as boundary objects in EA and digital transformation. The empirical questions are what role are they currently employed in, and what is the intended role? And how do they function in that role (i.e., how effective are they?)

• Future studies should investigate multiple levels of hierarchical abstraction in which STS design may occur, and how RAs are employed at each level. RAs may be useful at high levels of abstraction, but perhaps not so much at lower levels where specific solutions begin to emerge.

While not conclusive in this study, we believe this discussion can help to frame future research that not only will address the role of RAs as useful artifacts in the design of STS for digital transformation, but also potentially explore the effectiveness of other artifacts and methods in the STS design process. The next steps should focus on the collection of empirical evidence to test these ideas and their effectiveness. We have reason to be confident that these investigations can help to enable digital transformation initiatives to be more timely and effective in the future.

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