

Exploring Digital Sustainability Metrics: Developing a Comprehensive Framework to Measure Sustainable Digital Practices

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ABSTRACT

Digital sustainability is inevitable for today's environment and sustainability. Digital technologies can help to manage sustainability effectively and efficiently. It's also important to understand the progress of sustainability and how technologies help to make digital sustainability practices successful. Measuring digital sustainability is a complex task and it requires consideration of all the influencing factors to have an accurate measurement of progress. It requires the standardization of sustainability components and factors across industries as technology changes and evolves rapidly. This research article explores the essential factors of environmental, social, and economic factors. We also considered technology factors as one of the determinants of measurement as it supports all other factors to make it successful and measurable. This paper also proposes a framework to measure the score of digital sustainability based on factors of each component. The significant factors, usage, and limitations and proposes a formula for calculating a Digital Sustainability Score. This framework can be customized, and factors can be prioritized based on business requirements. This measurement will help the companies to understand the status of digital sustainability practices, and this can be tuned based on sustainability goals. There are many challenges to measuring digital sustainability as it requires the collection of data for each factor, in-depth knowledge, and deployment of significant resources. While this framework is an attempt to understand all the major factors and requires a specific focus on industry. Though this paper addresses Social, environmental, economic, and digital technology factors, it requires a more comprehensive framework and a separate list of factors for each specific industry.

Keywords: digital sustainability, sustainability metrics, sustainable digital practices, framework, literature review, case study analysis, systematic review, environmental impact, ICT.

INTRODUCTION

Digital sustainability is an emerging area that focuses on social, economic, and environmental impacts with the help of digital technology.

In today's era, it is crucial to use digital technologies like AI and IoT in the measurement process to gauge the impact of sustainability factors. It is effective and efficient to measure the current status and the gap to reach the milestone. Advanced technologies like machine learning and predictive algorithms can also help to understand the consequences of sustainability factors. A significant and integral part of digital sustainability is digital preservation, which has focused on one technical concern after another as issues and fashions have shifted over the last twenty years. Digital sustainability is demonstrated as providing an appropriate context for digital preservation because it requires consideration of the overall life cycle and technical, and socio-technical issues associated with the creation and management of digital items. (Bradley, 2007). Digital sustainability is a concept that draws huge attention due to rapid changes in technology and its support to manage sustainability effectively. It has huge potential to leverage the technologies for better collaboration and sharing. (Cybercom Group, 2021).

Digitization contributes a platform for innovations and an area where researchers or users can analyze and visualize complex data. Sustainability measurement requires the processing of massive data to understand the objective and to find the insight of collected data. It helps to understand and adopt new factors to measure progress accurately. According to a study published in Nature, AI could help achieve 79 % of the Sustainable Development Goals (SDGs). As we saw in the video, this technology could become a key tool for facilitating a circular economy and building smart cities that use their resources efficiently.(Vinuesa et al., 2020a).

Digitization sustainability is an approach to transform the potential of digital technologies to tune the sustainability factors that are responsible for positive effects on society and the environment. Digital technology can be helpful to drive positive change for the betterment of society and sustainable outcomes. The integration of sustainability and digital technology would be helpful to address the challenges we have to make it successful. Measurement is essential for the success of digital sustainability because it provides valuable insight into performance and milestones. Measurement also helps to understand whether we are in the right direction and if not then what could be the necessary improvements required. Measurement of digital sustainability helps to define the accountability of actions and their outcomes. As an organization, it helps to understand the strength and weaknesses of each factor of sustainability. Sustainability factors help to decide to prioritize the outcomes that are essential for digital sustainability. Measurement is the backbone and drives continuous improvement to make it better. The milestones are not final but its incremental and continuous optimization.

It may also be seen that the concept of sustainable development gave birth to new terms such as “societal responsibility” and “economic, social and environmental performance”(“Our Common Future, Chapter 2: Towards Sustainable Development - A/42/427 Annex, Chapter 2 - UN Documents: Gathering a body of global agreements,” n.d.). Social Metrics, Environmental Metrics, and Economic Metrics are three pillars of sustainability. Environmental and economic metrics are quantitative and Social Metrics are qualitative. Many papers discuss each pillar and its factors. But their little research has been done conspiring all the factors and how the measurement of these factors can be optimized with the help of digital technologies. Digital sustainability has one support component which is digital technology. This paper aims to address this gap by exploring the technology factor in Digital Sustainability. The proposed digital sustainability measurement framework will provide a base to measure the success of each metric. The systematic literature review has been conducted and a taxonomy of the key indicators for each metric has been captured for measurement framework. The core Digital Sustainability Metrics are proposed to measure and monitor Sustainable Digital Practices. The paper suggests integrating technology metrics into a comprehensive framework for Digital Sustainability as one of the major factors.

Research Questions:

- What are the most effective digital sustainability metrics to measure its progress?
- A comprehensive framework to cover all the indicators of Social, Environmental, Economic, and Technology metrics to measure digital sustainability progress.
- How the proposed framework can be applied to evaluate digital sustainability.

LITERATURE REVIEW

The research paper aims to create a comprehensive framework to measure digital sustainability with the help of social, environmental, economic, and technological metrics. The main research questions to be addressed in this study are: What are the key components of digital sustainability metrics? How can these metrics be used to measure sustainable digital practices?

The search for articles will be conducted using keywords related to digital sustainability metrics, sustainable digital practices, business performance, capabilities, and relevant theoretical approaches such as stakeholder theory and transaction cost theory. The search will be primarily based on the ScienceDirect and Google Scholar databases.

The proposed study's contribution to the field lies in developing a comprehensive framework to measure sustainable digital practices, which can be used by businesses to increase their performance and competitiveness in the digital age. The study will also help to fill the gap in the existing literature on digital sustainability metrics and sustainable digital practices.

Methodology

The present investigation was conducted following a meticulous and structured methodology, which builds upon earlier research studies. Specifically, we utilized a comprehensive systematic literature review approach to examine the metrics associated with digital sustainability and its underlying factors. This type of approach is highly advantageous when researchers endeavor to establish a clear and replicable process, as it enables us to thoroughly identify, assess, and summarize all pertinent literature on the subject matter at hand. By doing so, we can gain a comprehensive understanding of the topic and produce a more comprehensive analysis.

The first phase is Material Collection where the focus is to collect the relevant study material. The material collection phase includes two sub-phases: selection of database and targeted keyword to fetch the right research papers. The objective is to find the most relevant keywords to identify the research papers based on digital sustainability and components. The combination of keywords and Boolean operators is used to search the database for the right articles.

The next phase is article and material selection. This phase explains the qualification criteria to decide whether the article should be part of this study or not. The criteria make sure that the selected articles are relevant and would be helpful for research objectives.

The next phase is research results where the findings are organized, and the review process started. It involves the selection of a database to search for the right literature. The Scopus database, google Scholar were chosen as it provides material from Science Direct, Emerald Insight, Springer Link, Wiley Online Library, and more. The below strings are used to search for articles.

Table 1 provides detailed information on the search string used and the total number of articles that were found.

Insert Table 1 about here.

Table 1: Strings used for the collection of articles

Strings used for search	Number of Articles
Digital Sustainability, sustainability, digital sustainability metrics, social sustainability metrics, economic sustainability metrics, environmental sustainability metrics	419

Article Selection

According to Table 1, the query on the above-mentioned database resulted in 378 articles. To ensure that only relevant articles were considered for the investigation, two selection criteria were defined. The first criterion involved screening the title and abstract of each article to check its adherence to the general topic of digital sustainability. For instance, papers that solely focused on digital sustainability metrics, social sustainability metrics, environmental sustainability metrics, and economic sustainability metrics. This screening process yielded a list of 246 articles. The second criterion involved reading the full text of the selected articles, resulting in the exclusion of an additional 42 papers. The results of the material selection phase are presented in Table 2.

 Insert Table 2 Article selection criteria

Table 2: Article selection criteria

Strings used for search	Number of Articles
Initial Sample	378
After title and abstract screening (Title and abstract screening is a preliminary step in the material selection phase of a review. It involves reading the title and abstract of each article to evaluate its relevance to the research topic and the inclusion and exclusion criteria. This step is essential in identifying articles that are irrelevant to the topic under investigation and excluding them from further consideration.)	246
After the full-text screening (It refers to the process of reading the entire text of selected articles during the material selection phase of a review. This step allows for a more thorough evaluation of the relevance of the article to the research topic and the inclusion and exclusion criteria.)	204
List of articles for final consideration	204

Digital Sustainability Metric and Its Components

A metric is a quantitative measurement or indicator used to evaluate the performance, progress, or quality of a particular process, project, or system ("Metric - Wikipedia," n.d.). Metrics are important because they provide a way to objectively measure and track progress toward specific goals or objectives. Without metrics, it would be difficult to determine whether a particular process or project is successful or whether improvements are needed. In the context of digital sustainability, metrics are crucial for assessing the environmental, social, and economic impact of digital technology usage and operations. These metrics will help organizations to focus and improve for better results to achieve digital sustainability. The metrics are useful for continuous improvement and to understand the difference from the objective. The status for each indicator helps to provide a warning to tune the process to make it effective and efficient. Additionally, the use of metrics facilitates benchmarking against other systems and effectively communicates ideas to stakeholders (Paula Ochoa & Pinto, 2014).

Furthermore, sustainability indicators aid in decision-making processes by providing a framework for formulating strategies and establishing improvement goals. By tracking progress, the metrics enable

organizations to continuously improve their sustainability performance (Paula Ochôa & Pinto, 2014). It's worth noting that improvement can be categorized as Strong Sustainability, which refers to a scenario where at least one metric improves without the others declining. Alternatively, Weak Sustainability pertains to achieving an aggregate metric that aligns with targeted values in a process development context.

The adoption of the 2030 Agenda for Sustainable Development by the United Nations General Assembly represents a momentous turning point in the history of global development. This comprehensive strategy, consisting of 17 Sustainable Development Goals (SDGs), is aimed at transforming our world by eradicating poverty, reducing inequality, and combating climate change, among other pressing challenges (Weinberger, Rankine, Amanuma, Surendra, & Victoria Van Hull, 2015). The 2030 Agenda is not merely a lofty aspiration, but a concrete commitment by the global community to pursue sustainable development in a balanced and integrated manner, across all three dimensions: economic, social, and environmental. Achieving sustainable development is no small feat, but the integration of these dimensions is crucial to making progress toward this goal. While each of the SDGs represents a distinct area of focus, they are all interconnected, with progress in one area influencing progress in others. Thus, the pursuit of sustainable development requires a holistic approach that recognizes the complexity and interconnectedness of the challenges we face (Weinberger et al., 2015).

Environmental Metrics and Its Factors

The environmental metric is one of the key components of digital sustainability metrics. It assesses the environmental effect. It is related to the use of natural resources (Input) and the generation of waste due to waste. The waste may harm the environment if there is no possibility of conversion to its earlier stage or no positive impact on the environment. Some important environmental indicators include water consumption, energy consumption, and e-waste generation. The measurement of energy consumption and tracking may help organizations to identify areas where they can decrease their carbon footprint and reduce energy consumption.

The goal of sustainability is to minimize the environmental impact of using non-renewable resources and generating waste and pollution. However, achieving this goal is often easier said than done, as every technology has its unique environmental costs and limitations (Fedkin, 2016).

That's why it's important to not only measure the actual environmental impact but also to evaluate the rate at which the environment can recover and absorb these impacts. This way, we can better understand the true sustainability of a particular technology or activity and take steps to minimize its negative effects.

Table showing how digital sustainability can help reduce the negative impact of the metrics listed in the previous table:

Insert Table 3: Environmental Metrics and Its Factors

Table 3: Environmental Metrics and Its Factors

Metric	Negative Impact	How Digital Sustainability Can Help	Reference
Energy Consumption	Contributes to climate change	Use of renewable energy sources for digital infrastructure; optimization of energy usage through energy-	(Ergasheva, Khomyakov, Kruglov, & Succil, 2020a, 2020b; Faucheux & Nicolaï, 2011; S. Ma, Ding, Liu, Ren, & Yang, 2022;

		efficient hardware and software	Pihkola, Hongisto, Apilo, & Lasanen, 2018)
Raw Material Usage	Depletes non-renewable resources	Recycling and reuse of electronics; development of the circular economy for electronics; use of alternative, sustainable materials	(Ekins et al., 2019; Patwa et al., 2021; Seif, Salem, & Allam, 2023; Williams, 2022)
Water Consumption	Depletes freshwater resources	Implementation of water-efficient practices and technologies; water recycling and reuse; use of non-potable water sources for cooling systems	(Design & Changes, n.d.; X. (Cissy) Ma, Xue, González-Mejía, Garland, & Cashdollar, 2015; Rodriguez et al., 2009; “Water Recycling and Reuse Region 9: Water US EPA,” n.d.)
Emissions of Greenhouse Gases (GHG)	Contributes to climate change	Use of renewable energy sources; optimization of energy usage; use of carbon capture and storage technologies	(Abdallah & El-Shennawy, 2013a, 2013b; Edenhofer et al., 2011; Kabeyi & Olanrewaju, 2022; Terlouw, Treyer, Bauer, & Mazzotti, 2021)
E-waste Generation	Generates hazardous waste and pollutants	Designing products for easier repair, reuse, and recycling; promoting extended product lifetimes; developing a circular economy for electronics	(Abalansa, El Mahrad, Icely, & Newton, 2021; Althaf, Babbitt, & Chen, 2019; Turaga et al., 2019; Vishwakarma et al., 2022)
Land Usage	This can lead to habitat loss and fragmentation	Development of more compact and efficient digital infrastructure; use of brownfield sites and existing buildings for data centers	(Du et al., 2015; EEA, 2015; Huggins, 2018; “Planning and Resource Management Reference Materials,” n.d.; “Reaping the Rewards of Sustainable Land Use,” n.d.; “Towards Sustainable Land Use,” 2020)
Toxicity Potential	Can harm human health and the environment	Use of safer materials and production processes; proper management of hazardous waste and pollutants; promoting transparency in supply chains	(Bandarra, Silva, Pereira, Martins, & Quina, 2022; “How Hazardous Waste Disposal Affects the Environment,” n.d.; Metals et al., n.d.; Watts & Teel, 2003)
Digital Inclusion	Can exacerbate social and economic inequalities	Ensuring equitable access to digital products and services; promoting digital literacy and skills development; addressing the digital divide	(“How digital inclusion can improve people’s lives and promote sustainable development ITCILO,” n.d.; “This is how to finance digital inclusion World Economic Forum,” n.d.; Nguyen, 2020a; O’Sullivan, Clark, Marshall, & MacLachlan, 2021)

Social Metrics and Its Factors

Social metrics are concerned with the social impact of digital technology, including fair labor practices and ethical use of technology. According to the Western Australia Council of Social Services (WACOSS): "Social sustainability occurs when the formal and informal processes; systems; structures; and relationships actively support the capacity of current and future generations to create healthy and liveable communities. Socially sustainable communities are equitable, diverse, connected, and democratic and provide a good quality of life"(WACOSS, 2002).

According to Social Life, a UK-based social enterprise specializing in place-based innovation, Social sustainability is a process for creating sustainable successful places that promote wellbeing, by understanding what people need from the places they live and work. Social sustainability combines the design of the physical realm with the design of the social world – infrastructure to support social and cultural life, social amenities, systems for citizen engagement, and space for people and places to evolve(Woodcraft, Bacon, And, & Hackett, 2012).

As the world becomes increasingly digital, the concept of sustainability has evolved to include not just environmental and economic factors, but also social dimensions. Social sustainability refers to the ability of societies to maintain healthy and liveable communities that are equitable, diverse, connected, and democratic. However, measuring social sustainability can be a challenge, as the metrics are often qualitative and hard to quantify. In this context, the use of digital technologies can play a crucial role in improving social sustainability, by facilitating the measurement and monitoring of social metrics.

Insert Table 4: Social Metrics and Its Factors

Table 4: Social Metrics and Its Factors

Metric	Negative Impact	How Digital Sustainability Can Help	Reference
Quality of life	Basic needs not being met; low quality of life for some groups	Monitoring and measurement of social indicators; targeted interventions	(Barykin et al., 2023; Comitee, 2011; FY2010, 2010; Grum & Kobal Grum, 2020; Mondejar et al., 2021a; Musarat, Sadiq, Alaloul, & Abdul Wahab, 2023)
Equity	Unequal opportunities and outcomes for different groups	Promoting inclusivity and diversity; targeted interventions	(Brenner & Hartl, 2021a, 2021b; Cooper, 2021; "Pursuing Sustainability with Social Equity Goals icma.org," n.d.; WACOSS, 2002)
Diversity	Lack of understanding and acceptance of diverse groups	Promoting cross-cultural communication and awareness	(Jankelová, Joniaková, Procházková, & Blštáková, 2020; Segerstedt & Abrahamsson, 2019; "Social Challenge 8 – Diversity & Inclusion Why it matters Maximizing well-being for all Sustainability NTT," n.d.; "Why is Diversity and Inclusion Important for Sustainability?," n.d.; Syed, 2014; WACOSS, 2002)

Democracy and governance	Lack of transparency and accountability in decision-making processes	Promoting open and participatory governance through digital tools	("Part I : Background of the Development of HSM --for the first reader of HSM theory, this part is prepared," n.d.; Tulchin, Varat, Ruble, & Woodrow Wilson International Center for Scholars. Comparative Urban Studies Project., 2002; WACOSS, 2002; Westall, 2023; Wydra & Pülzl, 2013, 2015)
Maturity	Lack of personal growth and development	Providing access to education and learning resources through digital tools	(authorPerson:McKeown, 2002; CooperGibson Research, 2022; Daniela, Visvizi, Gutiérrez-Braojos, & Lytras, 2018; Napal, Mendióroz-Lacambra, & Peñalva, 2020; WACOSS, 2002)

Note: The above table is a summary of the social metrics and their dimensions discussed in the text. The negative impacts and ways in which digital sustainability can help address them are based on the analysis presented in the paper.

Economic Metrics and Its Factors

Economic metrics are concerned with the economic impact of digital technology usage and operations. These metrics evaluate the economic benefits or costs of digital technology usage and operations. For example, an organization might measure the cost savings associated with the adoption of digital technology. Other important economic metrics include the economic impact of digital technology on local communities, the cost of transitioning to a sustainable digital economy, and the potential economic benefits of digital sustainability.

Insert Table 5: Economic Metrics and Its Factors

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Metric	Negative Impact	How Sustainability Can Help	Reference
Competitiveness	Inability to keep up with competitors	Digital sustainability can help companies innovate and streamline their processes to stay ahead of competitors	(Delgosha, Saheb, & Hajiheydari, 2021; Kisel'áková, Šofranková, Gombár, Cabinová, & Onuferová, 2019; Kukushkina, Mursaliev, Krupnov, & Alekseev, 2022; Möbius & Althammer, 2020; Popescu, Sima, Nica, & Gheorghe, 2017)
Customization	Wasted materials and resources in producing	Digital sustainability can enable more efficient and targeted production of	(Chen, Despeisse, & Johansson, 2020a, 2020b; Cricelli & Strazzullo, 2021a; Han et al., 2023a)

	customized products	customized products, reducing waste and saving resources	
Economic development	Harmful environmental impacts from economic growth	Digital sustainability can promote sustainable economic growth through reduced resource consumption and increased efficiency	(Cricelli & Strazzullo, 2021b; International Labour Organisation (ILO), 2020; Kunkel & Tyfield, 2021; Mondejar et al., 2021b; Y. Q. Zhang, Li, Sadiq, & Chien, 2023; Zhong et al., 2022)
Efficiency	Inefficient processes lead to wasted resources and increased emissions	Digital sustainability can optimize processes to increase efficiency and reduce resource consumption and emissions	(Beier, Kiefer, & Knopf, 2022; Bibri, 2009; "Digital Sustainability (2023): Importance & Top 5 Digital Solutions," n.d.; "Digitalization and Energy – Analysis - IEA," n.d.; "Energy and Climate Protection - BASF Report 2021," n.d.; Gupta Kirti & Effraimidis Georgios, 2021)
Extension of product/equipment life cycle	Discarded products/equipment leading to waste and pollution	Digital sustainability can facilitate the repair, repurposing, and recycling of products/equipment to extend their life cycle and reduce waste	(Berg et al., 2020; Chauhan, Parida, & Dhir, 2022; Dassault Systemes, 2021; <i>Environment at a Glance Indicators</i> , 2023; Han et al., 2023b; Šipka, 2021)
Fostering innovation and entrepreneurship	Limited resources and opportunities for innovation and entrepreneurship	Digital sustainability can open up new opportunities for innovation and entrepreneurship by promoting sustainable practices and creating new markets	(Van den Breul et al., 2018; Cricelli & Strazzullo, 2021c; Ely, Fressoli, & Van Zwanenberg, 2017; Filser, Kraus, Roig-Tierno, Kailer, & Fischer, 2019; Nations, 2022; Veleva, 2021; Yan, Gu, Liang, Zhao, & Lu, 2018)
Reduction of material consumption	Excessive use of materials leads to waste and depletion of resources	Digital sustainability can reduce material consumption through optimized production processes, waste reduction, and the use of sustainable materials	(Cricelli & Strazzullo, 2021c; Fredrick Royan, 2021; Mont, Lehner, & Dalhammar, 2022; Piscicelli, 2023a; Turan et al., 2022)
Production costs reduction	High production costs due to inefficient processes and wasted resources	Digital sustainability can reduce production costs through increased efficiency, waste reduction, and the use of sustainable materials	(Bai, Quayson, & Sarkis, 2021; Cricelli & Strazzullo, 2021c; Eyman, 2021; "Innovation needs in the Sustainable Development Scenario – Clean Energy Innovation – Analysis - IEA," n.d.; Nakicenovic et al., 2019; Palacká, Krechovská, & Číž, 2021; Ri & Automation, n.d.)
Productivity	Low productivity	Digital sustainability can increase	(American & Outlook, 2020; Cricelli & Strazzullo, 2021c; Field, Management, Services, & Performance, n.d.;

		due to inefficient processes	productivity through optimized processes, automation, and the use of digital tools	Moghrabi, Bhat, Szczuko, AlKhaled, & Dar, 2023; OECD, 2019a; I. Paper, 2019; Samadhiya et al., 2022; Santiago, 2021; United Nations, 2023)
Profitability of investments	of	Unsustainable investments lead to financial losses	Digital sustainability can improve the profitability of investments by promoting sustainable practices and reducing environmental risks	(“2022 sustainability consumer research: Sustainability and profitability IBM,” n.d.; Cricelli & Strazzullo, 2021c; Merrill, Schillebeeckx, & Blakstad, 2019; United Nation Environment Programme, 2022; World Economic Forum, 2021a)
Reduction of delivery times	of	Slow or inefficient delivery processes	Digital sustainability can improve delivery times through the optimization and automation of delivery processes	(Cricelli & Strazzullo, 2021c; Klein & Popp, 2022; World Economic Forum, 2021b)
Reduction of energy consumption	of	Excessive energy consumption leads to environmental harm and high costs	Digital sustainability can reduce energy consumption through increased efficiency, the use of renewable energy sources, and the optimization of energy systems	(Cricelli & Strazzullo, 2021c; Haiwei & Wang, 2009; Lange, Pohl, & Santarius, 2020; Strielkowski, Kovaleva, & Efimtseva, 2022; The Shift Project, 2020; Verma et al., 2020)
Reduction of transportation costs	of	High transportation costs due to inefficient transportation processes	Digital sustainability can reduce transportation costs through the optimization of transportation routes and modes, and the use of digital tools	(Akbari & Hopkins, 2022; Kayikci, 2018; Palkina, 2021; UNCTAD, 2018; UNECE, 2011; <i>UNECE Nexus: Sustainable Mobility and Smart Connectivity</i> , 2021; U.S. Department of Energy, U.S. Department of Transportation, U.S. Environmental Protection Agency, & U.S. Department of Housing and Urban Development, 2050)
Reduction of waste costs	of	High waste disposal costs due to excessive waste production	Digital sustainability can reduce waste costs through waste reduction, reuse, and recycling	(Bendix, Le, Vito, & Vrancken, 2019; C40 Cities Climate Leadership Group, 2015; Maciej Serda et al., 2021; Mattila, Mesiranta, & Heikkinen, 2020; Truong, 2022)
Reduction of water consumption	of	Excessive water consumption leads to environmental harm and high costs	Digital sustainability can reduce water consumption through increased efficiency, water recycling, and the use of alternative water sources	(Andrić, Vrsalović, Perković, Aglič Čuvic, & Šolić, 2022; Banerjee, Bhaduri, & Saraswat, 2022; Batista, Franco, Fakury, Porto, & Braga, 2022; Hubert, Wang, Alonso, & Minguez, 2020; Liu, Yang, & Yang, 2021; Maestu, 2015; Sachidananda et al., 2016)

Digital Technology Metrics and Its Factors

The world we live in is becoming increasingly digital, and with that comes a wealth of opportunities to address some of the most pressing societal and environmental issues. Digital technologies provide access to vast amounts of data that can be used to solve problems and create a more sustainable future. However, to make the most of these opportunities, we need to consider several key factors.

Sustainable development goals must be at the forefront of our thinking. By using digital technologies to promote sustainability, we can create a more equitable, ecologically sustainable, and healthy society. We also need to focus on digital technologies for socioeconomic development, equitable growth, and sustainable process for a better society. Digital technologies are essential components in the value chain to integrate common sustainability metrics and gauge efficiency.

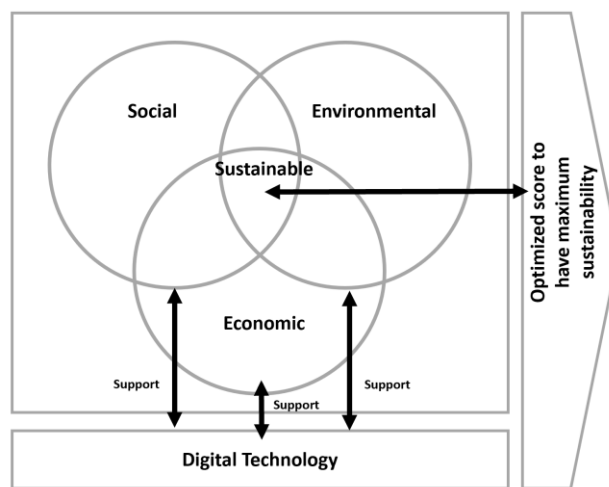


Figure 1. Adopted from sustainable development(see Brundtland Report 1987)

Table showing the list of digital technology factors that can support digital sustainability across the social, economic, and environmental dimensions, along with their uses:

Insert Table 6: Digital Technology Metrics and Its Factors

Table 6: Digital Technology Metrics and Its Factors

Technology Factor	Tools or Digital Technology	How it supports Environmental Metric	How it supports Social Metric	How it supports Economic Metric	Reference
Internet of Things (IoT)	Environmental Sensors	Real-time monitoring of resource usage, emissions, and waste	Improves health and safety, and promotes sustainable consumption	Reduces costs and promotes sustainable business practices	(Era & Era, 2021; Ibrahim, 2022; Rosca, Nicolae, Sanda, & Madan, 2021; World Economic Forum, 2018)

			and production		
Artificial Intelligence (AI)	Machine Learning Algorithms	Optimizes resource usage and reduces waste, and predicts environmental impact	Improves public services and enhances decision-making for social development	Increases efficiency and productivity, and enables innovation	(Galaz et al., 2021; Thamik & Wu, 2022; Vincent Pedemonte, 2020; Vinuesa et al., 2020b)
Blockchain	Distributed Ledger Technology	Provides transparency and traceability for supply chain management, and reduces fraud and corruption	Promotes fair trade and social responsibility, and ensures ethical business practices	Reduces transaction costs and enables secure and efficient financial transactions	(<i>Harnessing blockchain for sustainable development</i> , 2021; Joshi, Tewari, Kumar, & Singh, 2023; Khanfar, Iranmanesh, Ghobakhloo, Senali, & Fathi, 2021; Mhlanga, 2023; OECD, 2019b)
Renewable Energy	Solar, Wind, and Hydro Power	Reduces greenhouse gas emissions and dependence on fossil fuels	Provides access to clean energy and promotes energy security, especially in rural areas	Creates jobs and generates economic growth in the renewable energy sector	(Dekeyrel & Fessler, 2023; El, Abdelli, & Shahbaz, 2023; Mihai, Aleca, Stanciu, Gheorghe, & Stan, 2022; Wei, Li, Löschel, Managi, & Lundgren, 2021)
Big Data Analytics	Data Processing and Visualization Tools	Identifies patterns and insights for optimizing resource usage and reducing waste	Enhances public services and promotes evidence-based decision-making for social development	Enables market insights and enhances business competitiveness	(Raut et al., 2019; Şerban, 2017; D. Zhang, Pee, Pan, & Cui, 2022)
Digital Platforms	Collaborative Platforms and Apps	Facilitates collaboration across the value chain for sustainability and aligns on	Promotes social participation and engagement, and enhances access to	Enables new business models and creates new markets for sustainable	(Calabrese, Sala, Fuller, & Laudando, 2021; Caughie, 2013; Łobejko & Bartczak, 2021; Stepanova, Vorotnikov,

		common metrics and goals	public services	products and services	Doronin, & Vorotnikov, 2020)
Renewable Energy	Solar Panels, Wind Turbines	Reduces greenhouse gas emissions and dependence on fossil fuels	Increases energy access and affordability for underserved communities	Creates jobs in the renewable energy industry	(Keim, 2017; Latifah, 2020; UNCTAD, 2019; Yu, Tsai, Jin, & Zhang, 2022)
Sustainable Agriculture	Precision Farming Technologies, Drones	Reduces water and fertilizer usage, minimizes soil erosion, and preserves biodiversity	Improves food security and access to nutritious food, promotes rural development	Increases productivity and profitability for farmers	(Basso & Antle, 2020; Hrustek, 2020a, 2020b; Lajoie-O'Malley, Bronson, van der Burg, & Klerkx, 2020; Satpathy, 2022)
Smart Buildings	IoT sensors, Building Automation Systems	Reduces energy consumption and carbon footprint through optimized heating, cooling, and lighting	Enhances indoor air quality and comfort, promotes health and wellbeing	Lowers operational costs and increases asset value	(Froufe et al., 2020; Yang, Lv, & Wang, 2022)
Circular Economy	Blockchain, IoT, Digital Twins	Promotes reuse and recycling of materials, reduces waste and pollution	Facilitates transparency and traceability in supply chains, fosters collaboration and innovation	Generates economic value from waste and unused resources	(Bressanelli, Adrodegari, Pigosso, & Parida, 2022; Geissdoerfer, Savaget, Bocken, & Hultink, 2017; Piscicelli, 2023b; Wirtz, 2022)
Digital Inclusion	Digital Literacy Programs, Community Networks	Improves digital access and skills for marginalized communities, promotes social equity and inclusion	Enables participation in the digital economy and civic engagement, enhances the quality of life	Boosts economic productivity and innovation through a diverse and skilled workforce	(Erturk & Purdon, 2022; KIDD & LEE, 2018; Madon, Reinhard, Roode, & Walsham, 2006; Nguyen, 2020b; Nosratabadi & Atobishi, 2023)
Green Transportation	Electric Vehicles, Autonomous Vehicles	Reduces greenhouse gas emissions and air pollution, promotes sustainable mobility	Enhances safety and accessibility for all users, reduces traffic congestion and travel time	Stimulates innovation and investment in the transportation industry	(Li, Yang, Gao, & Han, 2022; P. Paper, 2022; "Sustainable Transport, Sustainable

					Development,” 2021)
Sustainable Packaging	Biodegradable Materials, Smart Labels	Reduces waste and pollution, enhance product safety and quality	Promotes consumer awareness and responsible consumption, fosters brand loyalty and trust	Improves supply chain efficiency and reduces costs	(Frank, 2022; Santi, Garrone, Iannantuoni, & Del Curto, 2022; Versino et al., 2023; Wandosell, Parra-Meroño, Alcayde, & Baños, 2021)
Water Management	IoT sensors, Water Treatment Technologies	Reduces water consumption and pollution, promote efficient water use and conservation	Improves access to safe and clean water, mitigates water-related risks and conflicts	Increases productivity and competitiveness in water-intensive industries	(Helena M. Ramos & Pérez-Sánchez, 2019; International Water Management Institute, 2019)

PROPOSED FRAMEWORK

The four components of environmental sustainability, economic sustainability, social sustainability, and technological sustainability are considered for the proposed framework to measure digital sustainability. Each component has multiple factors or indicators which will be considered based on the literature review. This framework is generic but based on the weightage of factors, the result can be tuned based on industry usage.

The environmental sustainability component and its factors are focused on the reduction of the impact on environmental aspects like energy consumption, carbon footprint, and waste generation. The economic sustainability component focuses on the financial performance of the organization like cost savings, revenue growth, and profitability. The social sustainability component focuses on the impact on society like the well-being of employees, customers, and communities. The weightage can be modified according to the priority of the organization and industry.

The technology component focuses on emerging technologies like artificial intelligence, blockchain, and the Internet of Things which supports the above components. Overall, the proposed framework provides a comprehensive and holistic approach to measuring the factors that can be used by organizations and policymakers to evaluate and improve their digital sustainability performance.

Insert Table 7: Four Components of Digital Sustainability

Table 7: Four Components of Digital Sustainability

Components	Description
Environmental	Focuses on minimizing the negative impact on the environment through measures.
Economic	Focuses on economic viability and sustainability.
Social	Focuses on social and ethical implications.

Technological	Focuses on emerging technologies to support Social, environmental, and economic components to increase performance.
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The four components are interconnected and interdependent. It provides more accurate results when we consider together for digital sustainability.

Insert Table 8: Weighted variables for four components of Digital Sustainability

Table 8: Weighted variables for four components of Digital Sustainability

Factor	Variable	Variable Name	Weighted Variable
Social	Quality of life	QOL	w1 * QOL
	Equity	EQ	w2 * EQ
	Diversity	DIV	w3 * DIV
	Democracy and governance	DEM	w4 * DEM
	Maturity	MAT	w5 * MAT
Environmental	Energy Consumption	EN	w1 * EN
	Raw Material Usage	RMU	w2 * RMU
	Water Consumption	WC	w3 * WC
	Emissions of Greenhouse Gases (GHG)	GHG	w4 * GHG
	E-waste Generation	EWG	w5 * EWG
	Land Usage	LU	w6 * LU
	Toxicity Potential	TP	w7 * TP
	Internet of Things (IoT)	IoT	w1 * IoT
	Artificial Intelligence (AI)	AI	w2 * AI
Digital Technology	Blockchain	BC	w3 * BC
	Renewable Energy	RE	w4 * RE
	Big Data Analytics	BDA	w5 * BDA
	Digital Platforms	DP	w6 * DP
	Sustainable Agriculture	SAG	w7 * SAG
	Smart Buildings	SBLD	w8 * SBLD
	Circular Economy	CEC	w9 * CEC
	Digital Inclusion	DI	w10 * DI
	Green Transportation	GT	W11*GT
	Sustainable Packaging	SP	W12*SP
	Water Management	WM	W13*WM
	Competitiveness	COMP	w1 * COMP
	Customization	CUST	w2 * CUST
Economic	Economic development	ED	w3 * ED
	Efficiency	EFF	w4 * EFF
	Extension of product/equipment life cycle	EXL	w5 * EXL
	Fostering innovation and entrepreneurship	INN	w6 * INN
	Reduction of material consumption	RMC	w7 * RMC
	Production costs reduction	PCR	w8 * PCR

Productivity	PROD	$w_9 * PROD$
Profitability of investments	PROF	$w_{10} * PROF$
Reduction of delivery times	DTIME	$w_{11} * DTIME$
Reduction of energy consumption	ECON	$w_{12} * ECON$
Reduction of transportation costs	TNC	$w_{13} * TNC$
Reduction of waste costs	WAC	$w_{14} * WAC$
Reduction of water consumption	WASC	$w_{15} * WASC$

To calculate the score for each factor, we need to sum up the weighted variables for each factor.

Here are the calculated scores for each factor:

 Insert Table 9: Overall Digital Sustainability score

Table 9: Overall Digital Sustainability score

Metric	Score calculation
Social Score (SS)	$(w_1 * QOL) + (w_2 * EQ) + (w_3 * DIV) + (w_4 * DEM) + (w_5 * MAT)$
Environmental Score (ENS)	$(w_1 * EN) + (w_2 * RMU) + (w_3 * WC) + (w_4 * GHG) + (w_5 * EWG) + (w_6 * LU) + (w_7 * TP) + (w_{11}GT) + (w_{12}SP) + (w_{13}WM)$
Digital Technology Score (DTS)	$(w_1 * IoT) + (w_2 * AI) + (w_3 * BC) + (w_4 * RE) + (w_5 * BDA) + (w_6 * DP) + (w_7 * SAG) + (w_8 * SBLD) + (w_9 * CEC) + (w_{10}DI)$
Economic Score (ECS)	$(w_1 * COMP) + (w_2 * CUST) + (w_3 * ED) + (w_4 * EFF) + (w_5 * EXL) + (w_6 * INN) + (w_7 * RMC) + (w_8 * PCR) + (w_9 * PROD) + (w_{10}PROF) + (w_{11}DTIME) + (w_{12}ECON) + (w_{13}TNC) + (w_{14}WAC) + (w_{15}WASC)$

Note that the weights (w_1 , w_2 , etc.) represent the importance of each variable within its respective factor. Organizational priority and objective influence the value of weights. More priority will take more percentage of weight. Weights are tuned based on relative importance with other factors.

Digital Sustainability Score = $(w_1 * SS) + (w_2 * ENS) + (w_3 * ECS) + (w_4 * DTS)$

where w_1 , w_2 , w_3 , and w_4 are the weights assigned to each of the four scores.

The weights will depend on the organizational context and priorities to measure digital sustainability. For example, if an organization has priority on social equity, then the social core will have a higher weight. Whereas, if an organization is focused on reducing environmental impact, then Environmental Score will have a higher weight. Digital Sustainability Score will help the organization to have insight into the areas where it is doing well and areas that need to improve. This insight can be used as feedback to tune the weights and digital sustainability strategy. The score can be standardized as a benchmark for peers and other organizations operating in the same segment.

LIMITATIONS

Several limitations make this framework challenging because of the evolution of new factors and technologies. One component may have a direct or indirect effect on other components. The success of one factor may decrease the success rate of another factor. Few factors can be measured in both quantitative and qualitative ways. Few are only through qualitative measurement. The final score is a mix of qualitative and quantitative measurements. This framework may not contain all the necessary factors and the addition of more indicators will provide more robust results. Standardization measurement scales are not done, and this may be necessary if the scales are different for environmental factors for any organization. The lack of a standardized set of components and metrics for measuring digital sustainability makes it difficult to compare performance across industries, or regions. This is because technology and areas are constantly evolving, and few factors may not be significant over the period. The unavailability of data is another limitation as organizations may not have the latest technology or process to capture the measurement for all factors. The development of a comprehensive framework requires significant effort, expertise, time, and budget. This may not be possible for smaller organizations.

CONCLUSION

This research is based on systematic literature search to create a conceptual framework with the most critical indicators. The digital technology and new factors that impact the society and environment are constantly changing. The landscape also changing, and components are breaking into new subcomponents. The framework needs to be updated with the pace of technology and inclusion of new metrics. The primary objective of organisation is making profit but keeping these indicators in mind will make the process optimised for society and environment. These metrics can be used by organizations or industries to assess their digital sustainability performance and recognize areas for enhancement. Measurement leads to an understanding of the gap from the goal, and it will help to promote the best practices to reduce negative impact and will enhance sustainability.

This can be possible with collaboration and effort from all stakeholders across the industry and organization. This framework is a skeleton and provides a base for organizations but there is a need for further research to refine and expand. Digital technologies can have a significant impact on all the sustainability components in both positive and negative directions. Technology may create more waste and at the same time, it can be used as a tool to mitigate any negative impacts. Technology can only provide the platform to gain insight, but it is up to us to act and prioritize the metrics to optimize digital sustainability performance.

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