

# Unlocking Potential: Rocking the Sustainable Future with Digital Twins

Judith Michael Software Engineering RWTH Aachen University

http://www.se-rwth.de

ModDiT Workshop @MODELS'23 01.10.2023, Västerås, Sweden



#### Real world challenges (some...)



Source: https://www.un.org/sustainabledevelopment/sustainable-development-goals/



Software Engineering | RWTH Aachen

# Should we really continue on this "highway to hell"?



# How can we from ModDiT contribute to a better world?

### **Sustainability**

- Ecological Sustainability
  - preserve and protect the *natural environment* over time
  - meet present needs without compromising the availability of resources in the future
- Social Sustainability
  - focus on the *well-being of people* and communities
  - promoting equity, human rights, access to education and health care, and decent work
- Economic Sustainability
  - conduct economic activities in a way that long-term economic well-being is possible
  - balance between economic growth, resource efficiency, social equity, financial stability



B. Purvis, Y. Mao, and D. Robinson, "Three pillars of sustainability: In search of conceptual origins," Sust. Science, vol. 14, no. 3, 2019.



Software Engineering | RWTH Aachen

#### **UN Sustainable Development Goals**



• 17 goals

- 169 targets
- measured by 231 indicators

#### Example

SDG 7
 Affordable and clean energy

- 5 targets, e.g.,
  - 7.3 "By 2030, double the global rate of improvement in energy efficiency."
- 6 indicators, e.g.,
  - 7.3.1 "Energy intensity measured in terms of primary energy and GDP."

https://sdgs.un.org/goals



#### **SDG Interlinkages | Synergies and Trade-Offs**



Source: https://knowsdgs.jrc.ec.europa.eu/interlinkages-goals

Software Engineering | RWTH Aachen



## **Digital Twins of Cyber-Physical Systems**





## **Digital Twins of Systems**



Software Engineering | RWTH Aachen



#### Digital Twins as complex, long-lasting, software-intensive systems



**Digital Twin** 





Digital Twins enable us to connect reality with the digital world and back



# How can our research contribute to the SUSTAINABLE ENGINEERING OF DIGITAL TWINS?

#### **Software Engineering and Sustainability**



Sustainable Business Practices

#### **How Green Is Your** Software?

by Sanjay Podder, Adam Burden, Shalabh Kumar Singh, and Regina Maruca

September 18, 2020



Hustiation by Ricardo Tomás

Harvard Business Review: https://hbr.org/2020/09/how-green-is-your-software

Green Software Foundation: https://greensoftware.foundation/articles/10-recommendations-for-green-software-development



Forbes: https://www.forbes.com/sites/forbestechcouncil/2022/08/18/the-power-of-sustainable-software/





## GREEN Energy, Hardware, Software, Software Engineering Processes, ...

GREEN (washing?) Energy, Hardware, Software, Software Engineering Processes, .

#### **Green IT**

- · ecological sustainability
- aims to reduce the environmental impacts associated with conventional IT, e.g.,
  - energy efficient hardware, data centers, server virtualization, monitoring systems



# The biggest impact of ICT as an industry is the amount of *greenhouse gas emissions*.

Source: https://www.innoq.com/en/articles/2023/02/what-is-sustainable-software/

#### 1.5% to 4% of global GHG emissions

Bieser, J. C. T., Hintemann, R., Hilty, L. M., & Beucker, S. (2023). A review of assessments of the greenhouse gas footprint and abatement potential of information and communication technology. Environmental Impact Assessment Review, 99.

#### Green software development

- Focus on & control features with higher power consumption and common usage scenarios
- Reduce data usage
- Limit *computational accuracy*
- Monitor real-time energy consumption of the application



- Developing and using lesspower-consuming ML models
- Monitor real-time power consumption during development

Source: https://greensoftware.foundation/articles/10-recommendations-for-green-software-development



#### Sustainable Software Engineering





Software Engineering | RWTH Aachen

### Sustainable Software Engineering

#### Sustainability is "preserving the function of a system over a defined time span" – 3 variables: system, function, and time

*B.* Penzenstadler, "Towards a definition of sustainability in and for software engineering," In ACM Symp. on Applied Comp. (SAC), 2013.



#### Perspectives

- Development processes
  - SE processes with responsible use of ecological, human, financial resources
- Software maintenance
  - maintain and evolve software with min. environmental impact, well-managed knowledge, sufficient economic balance
- System production
  - software is a concrete product including its hardware and the resources needed for production
- System usage
  - entire period of use of the software and its operational environment



#### Sustainable Digital Twin Engineering



#### Digital twins are active software systems

- Digital twins can be sustainably developed
  - Apply practices used for other software systems

#### Investigate

- What are specifics for digital twins?
- How can MDE support us in sustainable DT engineering?
- What are *challenges* using MDE for sustainable DT engineering?



#### **Model-Driven Engineering of Digital Twins | Benefits**



- Increased development speed and reduced development time
- Better software quality, e.g., less bugs,
  - well-defined domain-specific modeling languages, automated model checking, transformation, test and test case generation,...
- Improved maintainability

•

- Cross-cutting implementation aspects can be changed in one place which again reduces development time
- Empowered domain experts by providing low-code platforms for the development of digital twins

SE Software Engineering

#### MDE of Digital Twins | Where and how to consider sustainability?



#### • Models

 In addition to models for DT engineering: model sustainability, e.g., sustainability requirements and goals for DT engineering process and runtime of the DT

#### Data

- Measure sustainability targets & KPIs
- Reduce data usage

#### Services

- Monitor relevant indicators
- Simulate, forecast sustainability indicators
- Relate low-level sustainability goal with higher-level SDGs
- Analyze the DT and the "twinned" system and suggest more sustainable processes, connectivity, hardware, less power consuming services,...
- Visualize metrics, analysis results



## **MDE of Digital Twins | Costs & Research topics**



**Digital Twin** 

#### • Understand the costs of automation

- balance high quality in engineering processes vs. not wasting resources
- analyze processes e.g., nightly built, run tests, deploy daily
  - reduce energy consumption by, e.g., iterative builds
- Analyze the "twinning" functionality
  - Which degree of synchronization is needed?
  - What accuracy of models is needed?

- Power consuming services & models within DTs
  - analyze services and, e.g., use less-power-consuming ML models, re-use pre-trained ML models to avoid costly retraining of networks
- Composition/ Federation of DTs
  - How to compose DTs to improve maintainability?
  - What are the costs of federation vs. integration?

#### Finding balances is not easy!





# How can we use DTs TO ASSESS THE SUSTAINABILITY OF COMPLEX, SOFTWARE-INTENSIVE SYSTEMS?

## **Digital Twins for Sustainability**

- Creating DTs for sustainability assessment
  - assessment of sustainability targets
    - monitor, calculate and visualize key sustainability indicators
  - simulation and forecasting of sustainability indicators
    - use historic information together with forecasting algorithms
- Digital Twin services to
  - enable simulation of different variants of digital twins before building the physical one to improve resource efficiency
  - facilitate optimizing production processes towards waste reduction and energy saving allowing a responsible production
  - provide self-adaptability to improve resource efficiency
  - assist with responsible consumption and use in relation to created products



17 UN development goals (SDGs) with 169 associated targets



## DT during design of a software system



#### Services for analysis of sustainability

- architecture model analysis, e.g., optimize consumed resources
- scenario-based analysis, e.g., resource usage, identify resource-intensive parts

- ...

25

[HHMR23] M. Heithoff, A. Hellwig, J. Michael, B. Rumpe: Digital Twins for Sustainable Software Systems. GREENS'23 Workshop at ICSE'23



## DT during *implementation/generation* of a software system

Life cycle of the actual object: Soj	ftware
Design	Impl./Generation Operation End-of-Life
DTs of SPL softw	are
Digital Twin of individual softwo	re, or a Software Product Line
	<ul> <li>Creation of digital shadows         <ul> <li>logs of execution sequences, data about resources usage, development processes in tools, source code metrics</li> </ul> </li> </ul>
	<ul> <li>Services for         <ul> <li>identification and optimization of resource-intensive code sections</li> <li>analyzing the development process, e.g., identify least sustainabl parts, bottlenecks</li> </ul> </li> </ul>

[HHMR23] M. Heithoff, A. Hellwig, J. Michael, B. Rumpe: Digital Twins for Sustainable Software Systems. GREENS'23 Workshop at ICSE'23



#### DT during operation of a software system



[HHMR23] M. Heithoff, A. Hellwig, J. Michael, B. Rumpe: Digital Twins for Sustainable Software Systems. GREENS'23 Workshop at ICSE'23



Software Engineering | RWTH Aachen

#### DT during end-of-life of a software system



[HHMR23] M. Heithoff, A. Hellwig, J. Michael, B. Rumpe: Digital Twins for Sustainable Software Systems. GREENS'23 Workshop at ICSE'23



#### Paper: Digital Twins for Sustainable Software Systems

Digital Twins for Sustainable Software Systems Malte Heithoff Judith Michael Bernhard Rumpe Alexander Hellwi fiware Engineering Software Engineering RWTH Aachen University Software Engineering RWTH Aachen University RWTH Aachen University RWTH Aachen University Aachen Germany Aachen Germany Aachen Germany Aachen Germany hellwig@se-rwth.de michael@se-rwth.de rumpe@se-rwth.de Abirari—Sustainable software systems aim to create resource-efficient software products and reduce the carbon impact of applications. Current approaches for sustainability assessment of the software products and the software software software on methods in their engineering of sustainable software systems mittered of in the engineering of sustainable software systems mittered in the engineering of sustainable software systems interested in the engineering of sustainable software systems with a specific frees on sum good-effective engineering methods for the crustian of applications. We can generize accompanying system and gravite sorties for the assessment of sustainability assessment, and how MDE methods support the engineering of their DTs. The paper is structured the following: Section II provides foundations and related work. Section III presents our vision on how to use digital twins for sustainability assessment and discusses it, and the last section concludes. II. FOUNDATIONS AND RELATED WORK Whereas the General Assembly of the United Nations provides us with concrete 17 SDGs with 169 associated and provide services for the ass targets [2], translating these goals to software systems is still a challenge. Penzenstadler [13] defines sustainability "as ong run, this provides us with better assessment preserving the function of a system over a defined time span requiring to define the three variables system, function, and time. These can be defined in software engineering from four L INTRODUCTION spectives When technical developments are considered in terms of their social, economic, and environmental aspects of sustain-ability []], they should have a positive impact on our world. · Development processes: This includes software ening processes with responsible use of ecological, human, and financial resources. Software maintenance: This includes the maintenance and evolvement of a software system with minimized environsses with responsible use of ecolo To assess this impact, the United Nations have developed 17 To assess this impact, the United Nations have developed 17 sustainable development goals (SDGs) with 109 associated targets (2) we should achieve. Assessing software systems (2) based on these targets requires manual effort as one has to evaluate various aspects and task data from heterogeneous data sources into account. Up to new, sustainability assessment of mental impact, well-managed knowledge, and sufficien economic balance. System production: In this perspective, the software is considered a concrete product including its hardware and the resources needed for production.
 System usage: Here, we take the entire period of use of software systems is often a manual task. One has to manually software systems is often a manual task. One has to manually the assess different usiananhility criteria [El, e.g., with scenario-based techniques [B], and continuously update the assessment in case of changes in the software. Our aim is to investigate how to create sustainable software software sustainable software software software software sustainable software. the software and its operational environment into account There exists a large variety of metrics to assess gree software [14]. Venters et al. [3] suggest considering soft ility as a non-func onitor the sustainability goals of these synthesized systems. We suggest using Digital Twins (DTs) to accompany soft-reusability, scalability, and usability of a system enables us We suggest using Digital Teinis (DTs) to accompany soft-resultify, scalability, and usability of a system rankles us user systems in all life cycle phases to reach this goal. to make statements about its sustainability at an Opten-Poised System (DTs), e.g., anglases (B), can (E), architectual level (D). Sent et al. [4] describe canal data wind urthreas (B), machine elements (B), injection moding from offware products to their impacts on natural resources, machines (B), estables (DB) and (B) and (B) for soft-which programming for (DFs) (E) and the transferred to DTs for soft-which programming to use, complet optimization, we systems created using MDF methods. We discuss the life and implementation develops, have an inhume on the other stars systems created using MDF methods. We discuss the life and implementation develops, how an inhume on the other systems created using MDF methods. he Drucche Forchangemeinschult (DEG, Germa Reauerk, efficiency of programs [EG], ender Germany Kinaston Stranger, ACC 2003 Intent of RG21612. Website https://www.ips.wth-auben.de

sustainability assessment of applications

...more in the paper

#### Questions to discuss

 Is the engineering of an additional software system (the DT) sustainable?

Digital Twins of software systems to support the

 What are pros and cons for including sustainability services directly in software systems?

# **GREENS 2023**



[HHMR23] M. Heithoff, A. Hellwig, J. Michael, B. Rumpe: Digital Twins for Sustainable Software Systems. GREENS'23 Workshop at ICSE'23



Software Engineering | RWTH Aachen

## **Digital Twins for Sustainable (Cyber-Physical) Systems?**





#### Planning Citizen Energy Communities example

- Citizens and small commercial entities
- Local energy generation & storage
- Local energy trading
- Citizens interact directly with electrical distribution system

Research Question: How to enable system developers to iteratively evolve a system throughout its life cycle in a sustainable way?



[GKM+23] G. Gramelsberger, H. Kausch, J. Michael, F. Piller, F. Ponci, A. Praktiknjo, B. Rumpe, R. Sota, S. Venghaus: Enabling Informed Sustainability Decisions: Sustainability Assessment in Iterative System Modeling. In: ME Workshop @MODELS, 2023.

Software Engineering | RWTH Aachen



- Describe system with an architecture description language
  - MontiArc (MontiCore language workbench)

```
component CitizenEnergyCommunity{
                                          MA
 1
      ... port ...
 2
 3
      component Hospital hospital;
 4
      component CommercialHub comHub;
 5
      component ResidentialHub resHub;
 6
      component WindFarm windfarm;
 7
      component PowerDistributor distrib;
 8
      component EnergyStorage storage;
 9
      component CoalPowerplant powerplant;
10
11
12
13
14
15
    }
```



[GKM+23] G. Gramelsberger, H. Kausch, J. Michael, F. Piller, F. Ponci, A. Praktiknjo, B. Rumpe, R. Sota, S. Venghaus: Enabling Informed Sustainability Decisions: Sustainability Assessment in Iterative System Modeling. In: ME Workshop @MODELS, 2023.





- Describe system with an architecture description language
  - MontiArc (MontiCore language workbench)

```
component CitizenEnergyCommunity{
                                          MA
 1
      ... port ...
 2
 3
      component Hospital hospital;
 4
      component CommercialHub comHub;
 5
      component ResidentialHub resHub;
 6
      component WindFarm windfarm;
 7
      component PowerDistributor distrib;
 8
      component EnergyStorage storage;
 9
      component CoalPowerplant powerplant;
10
11
      satisfy sustainability{
12
        sdg: [7,11,13]...
13
      }
14
15
    }
```



[GKM+23] G. Gramelsberger, H. Kausch, J. Michael, F. Piller, F. Ponci, A. Praktiknjo, B. Rumpe, R. Sota, S. Venghaus: Enabling Informed Sustainability Decisions: Sustainability Assessment in Iterative System Modeling. In: ME Workshop @MODELS, 2023.



#### **Sustainability Assessment**

- Lifecycle Sustainability Assessment (LCSA)
  - LCA = Environmental Life Cycle Assessment
  - LCC = LCA-type Life Cycle Costing
  - SLCA = Social Life Cycle Assessment



- Lack a connection between LCSA indicators and SDG goals and more concrete target
  - As of 2022, 14 SDG goals have not yet been assigned LCSA indicators

- (Some) Challenges
  - Tool supported but also manual effort
  - Data availability
  - Some approaches in practice consider *only two* of the *three main sustainability aspects*
  - Lack *interconnectedness* among the three areas
  - Do not follow cause-effect chains
  - System boundaries unclear/ inconsistent
  - Non-transparent weighting of results
  - Lack of agreement in the international community on social targets to achieve for many social indicators

#### Sources

34

- M. Finkbeiner, E.M. Schau, A. Lehmann, M. Traverso: Towards Life Cycle Sustainability Assessment. Sustainability, 2010.
- S. Valdivia, J. G. Backes, M. Traverso, G. Sonnemann, S. Cucurachi, J. B. Guinée, T. Schaubroeck, M. Finkbeiner, N. Leroy-Parmentier, C. Ugaya, C. Peña, A. Zamagni, A. Inaba, M. Amaral, M. Berger, J. Dvarioniene, T.
- Vakhitova, C. Benoit-Norris, M. Prox, R. Foolmaun, M. Goedkoop: Principles for the application of life cycle sustainability assessment," The International Journal of Life Cycle Assessment, vol. 26, no. 9, 2021.
- J. Martínez-Blanco, A. Lehmann, P. Muñoz, A. Antón, M. Traverso, J. Rieradevall, M. Finkbeiner: Application challenges for the social Life Cycle Assessment of fertilizers within life cycle sustainability assessment. Journal of Cleaner Production, vol 69, 2014.



#### Conceptual model-based framework "Sustainability Evaluation Experience R" (SEER)



Source: J. Kienzle, G. Mussbacher, B. Combemale, L. Bastin, N. Bencomo, J.-M. Bruel, C. Becker, S. Betz, R. Chitchyan, B.H.C. Cheng, S. Klingert, R.F. Paige, B. Penzenstadler, N. Seyff, E. Syriani, C.C. Venters: Toward model-driven sustainability evaluation. Commun. ACM 63, 3, 2020.



Software Engineering | RWTH Aachen

- Indicators in components
  - Iterative Development | Component Change





[GKM+23] G. Gramelsberger, H. Kausch, J. Michael, F. Piller, F. Ponci, A. Praktiknjo, B. Rumpe, R. Sota, S. Venghaus: Enabling Informed Sustainability Decisions: Sustainability Assessment in Iterative System Modeling. In: ME Workshop @MODELS, 2023.



#### Enabling Informed Sustainability Decisions: Sustainability Assessment in Iterative System Modeling

Gabriele G	Hendrik K	ausch	Judith Michael *	
Theory of Science	Software Engi	neering	Software Engineering	
RWTH Aach	<b>RWTH Aachen University</b>		<b>RWTH Aachen University</b>	
gramelsberger@humtec.rwth-aachen.de		kausch@se-rwth.de		michael@se-rwth.de
Frank Piller		Ferdinanda Ponci		Aaron Praktiknjo
Technology and Innovation Management		E.ON Research Center		E.ON Research Center
RWTH Aachen University		at RWTH Aachen University		at RWTH Aachen University
piller@time.rwth-aachen.de		fponci@conerc.rwth-aachen.dc		apraktiknjo@concrc.rwth-aachen.d
Bernhard Rumpe	Re	ga Sota		Sandra Venghaus
Software Engineering	School of Busin	ness and Economics	School a	of Business and Economics
RWTH Aachen University	RWTH A	chen University	RW	TH Aachen University
	Children and the second	Contract of the second second	the second s	

binc susta

of susta

negative influences on different sust areas of social, economic, and environmental sus Research Question. We tackle the main

development scenarios in an a

Structure. We provide for

ment, and conclude with a roa

sing sustainability

how to enable system developers to iterati throughout its life cycle in a sustai

Contribution. To make these informed deci-

contribution, to make take informed accisions, we suggest a model-based approach that incorporates sustainability de-scriptions in Architecture Description Language (ADL) mod-els. This paper explores and introduces an approach to com-hing matchinghilton assessment defined in a Domini Sensitifi

through a system's evolution and leads to the implementa

to introduce the methodology for sustainable system

sility assessment defined in a Domain-Specifi

tmap for impleme

inable systems. As a running example, we show tw

conte and tooling for aim is to allow me ed into ADLs a Language (DSL) with ADL models throughout an iterativ development process. The approach supports decision-making on how to

g. Domain-Specific Lan-Energy Pla

#### I. INTRODUCTION

Motivation. When developing and evolving systems, tech-nologies, and processes over a longer period of time sus-tainability plays a significant role in each decision point of developers. Such systems include the production domain, Internet of Things (IoT), Cyber-Physical System (CPS), or

II. PRELIMENARIE Architecture Description Languages. For modeling system ADLs [3] offer great possibilities for iterative develo Most ADLs follow the component-connector approach, a system architecture is defined by its components/pa their connectors/ports. Often, additional (behavior) description Internet of Things (IdT), Cyber-Physical System (CPS), or una Connectorspont. Otta and the connection of the connect strong has preventioned and the connect strong has preventioned and the connect strong has prevention of the connect strong has been been communication interface drongs input and output prevention. Facilitate the sustainability decision-making throughout the *lifecycle of systems* by embedding sustainability descriptions in ADL models

...more on Tuesday!

#### Tue 3 Oct 2023 10:30 - 12:00 at 104 (40) - ME: Session 2

#### ME: Session 2

- 10:30 11:00 "Towards a Taxonomy of Digital Twin Evolution for Technical Sustainability" by Istvan David and Dominik Bork
- 11:00 11:30 "Enabling Informed Sustainability Decisions: Sustainability Assessment in Iterative System Modeling" by Gabriele Gramelsberger, Hendrik Kausch, Judith Michael, Frank Piller, Ferdinanda Ponci, Aaron Praktiknjo, Bernhard Rumpe, Rega Sota, and Sandra Venghaus



International Workshop on Models and Evolution

Special theme: Sustainability

3 October 2023, Västerås, Sweden Co-located with MODELS 202

#### Scientific commercial break



#### Submission

 Manifest your intent to submit via email to jot2023dtevolution@easychair.org (latest Oct gth. 2023) • Prepare your submission with the JOT LaTeX template • Submit using the OR code available on this page

## Springer

#### Call for Papers

Editors Istvan David istvan david@umontreal.ca McMaster University, Canada University of Montreal, Canada

Ankica Barisic ankica.barisic@inria.fr INRIA Sophia-Antipolis, France Université Côte d'Azur, France

Dominik Bork dominik bork@tuwien.ac.at TU Wien, Austria

Editors-in-Chief

Benoit Combemale University of Rennes 1 Jeff Gray

University of Alabama Bernhard Rumpe RWTH Aachen Universit

Important Dates Intent to submit Paper submission Notification

Software and Systems Modeling

#### Theme Section: Modeling and Sustainability

The perception of the value and propriety of modern engineered systems is changing. In addition to their functional and extrasystems is clauging. In addition to the indication and exact functional properties, novadays systems are also evaluated by their sustainability properties. The next generation of systems will be characterized by an overall elevated sustainability—including their post-life, driven by efficient value retention mechanisms. Current systems engineering practices fall short to support these ambitions due to the highly multi-systemic and stratified nature of sustainability, and need to be revised appropriately. Modeling offers numerous benefits in understanding and assessing the sustainability properties of engineered systems. Modeling languages and tools support subject matter experts in expressing their views, process models allow for reasoning about trade-offs across the end-to-

end systems engineering process, and runtime models allow for controlling engineering endeavors for sustainability. These are just a few of the many ways to support sustainability ambitions by modeling. It is, however, equally important to develop sustainable model-driven engineering techniques to avoid defeating the purpose.

To this end, the Journal of Software and Systems Modeling (SoSvM) prepares a theme section on "Modeling and Sustainability" and invites high-quality submissions covering topics including but not limited to

У	<ul> <li>modeling for sustainability and sustainability of modeling.</li> <li>technical sustainability: system/model (co-)evolution, techniques promoting prolonged system lifecycle</li> <li>environmental sustainability: energy consumption of modeling, modeling and simulation of energy consumption</li> <li>social sustainability: ethical concerns and modeling/good</li> <li>economic sustainability: duality and cost trade-offs, cost assessment methods</li> </ul>				
	<ul> <li>frameworks and tools</li> </ul>				
1 Dec 2022	<ul> <li>reference frameworks, taxonomies, ontologies</li> </ul>				
DI Dec 2023	o open-source modeling and simulation tools				
1 Mar 2024	<ul> <li>digitalization for sustainability: Digital Twins, Digital Inread</li> </ul>				
01 May 2024	<ul> <li>Industry 5.0 as a sustainability-rocused movement</li> </ul>				
	<ul> <li>sustainable and circular systems engineering</li> </ul>				
	<ul> <li>empirical inquiries, surveys, case studies, tool evaluations</li> </ul>				
	<ul> <li>training and education, especially on the topic of developing the next generation of systems engineering professionals</li> </ul>				







Software Engineering | RWTH Aachen

🔗 jot.fm 🔰 @jotfm

Editors

How to model connections between sustainability indicators?

How to improve the automation of sustainability assessment?

How to balance sustainability requirements and SW quality requirements in DT engineering?

How to model sustainability requirements?

How to assess sustainability for socio-technical systems?

Which metrics are relevant for measuring sustainability of DTs?

How to map low-level sustainability requirements of actual systems to high-level SDGs?

How to simulate sustainability scenarios within digital twins?



- Develop sustainable engineering methods to create DTs
- Develop sustainable methods to run DTs
- Use DTs to assess the sustainability of systems
- Model sustainability





