



# Towards Sustainable Systems: Paving the Way with Digital Twins

Judith Michael  
Software Engineering  
RWTH Aachen University

<http://www.se-rwth.de>

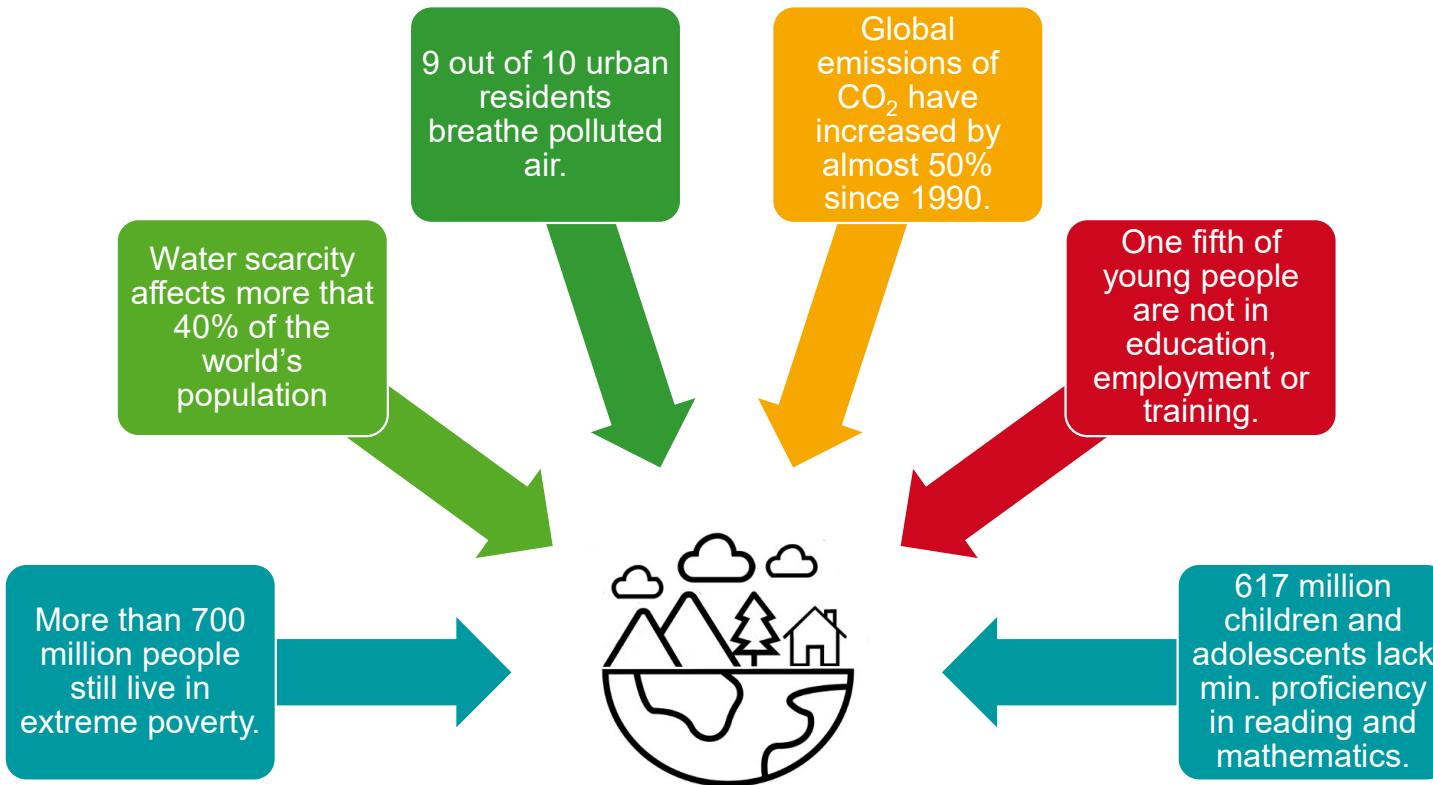
*EDT Seminar Series  
04.12.2023, Online*

A photograph of a waterfall cascading down a rocky cliff into a pool of water, surrounded by dense tropical vegetation. A semi-transparent white rectangular box is positioned in the upper right area of the image, containing a quote.

***“What you do makes a difference, and  
you have to decide what kind of  
difference you want to make.”***

***Jane Goodall***

## Real world challenges (some...)



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



*Should we really continue on this  
„highway to hell“?*

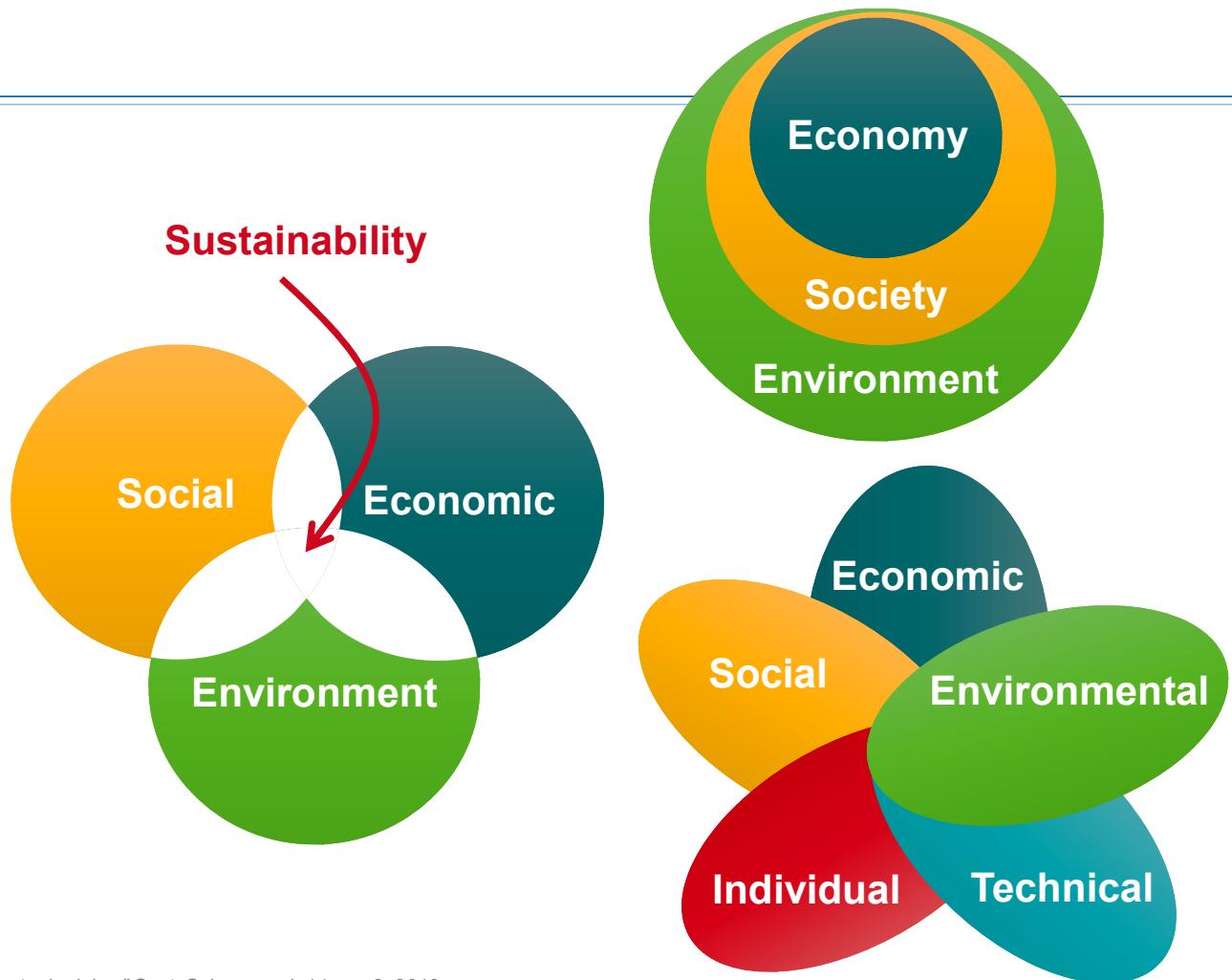




How can we from the EDT.community  
contribute to a better world?

## 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.

# UN Sustainable Development Goals



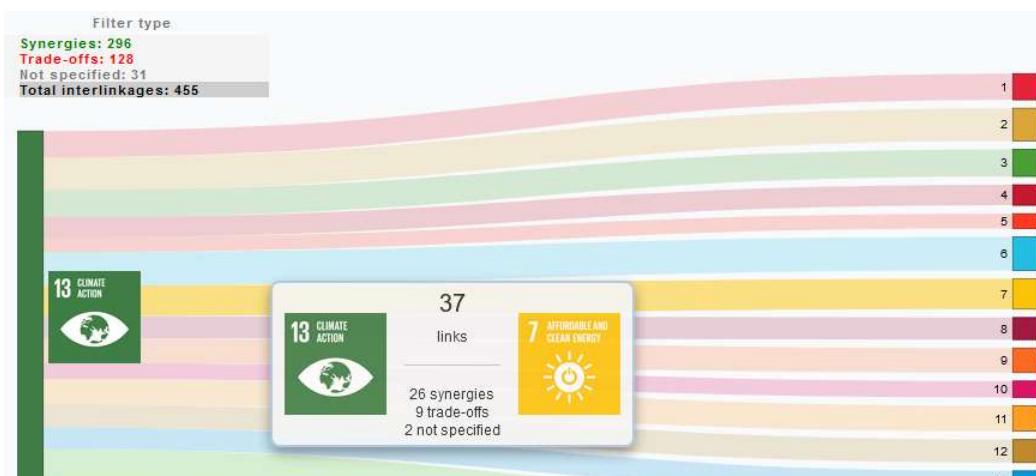
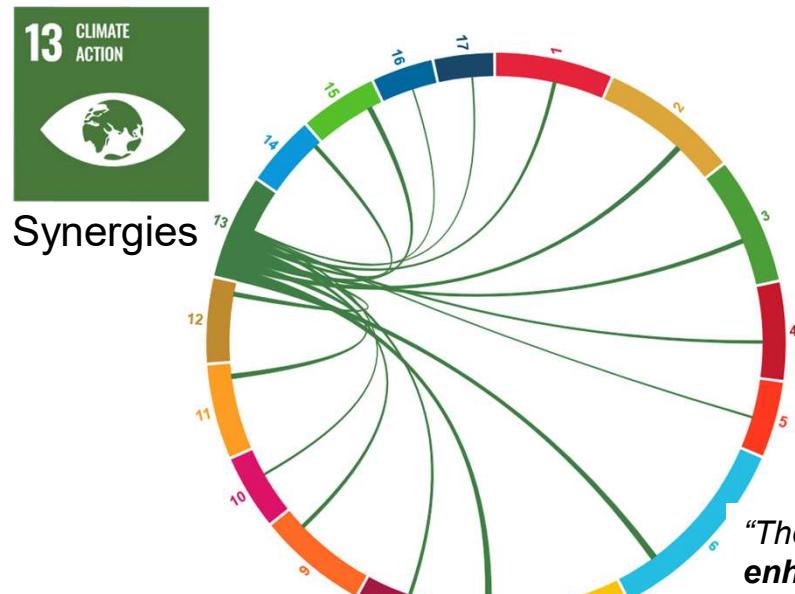
- 17 goals
  - 169 targets
  - measured by 231 indicators

## 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



*"The increase in diversity of (clean) energy sources and related infrastructure investments would enhance access to modern energy services (here we defined all low-carbon energy sources as modern), but energy affordability may be affected."*

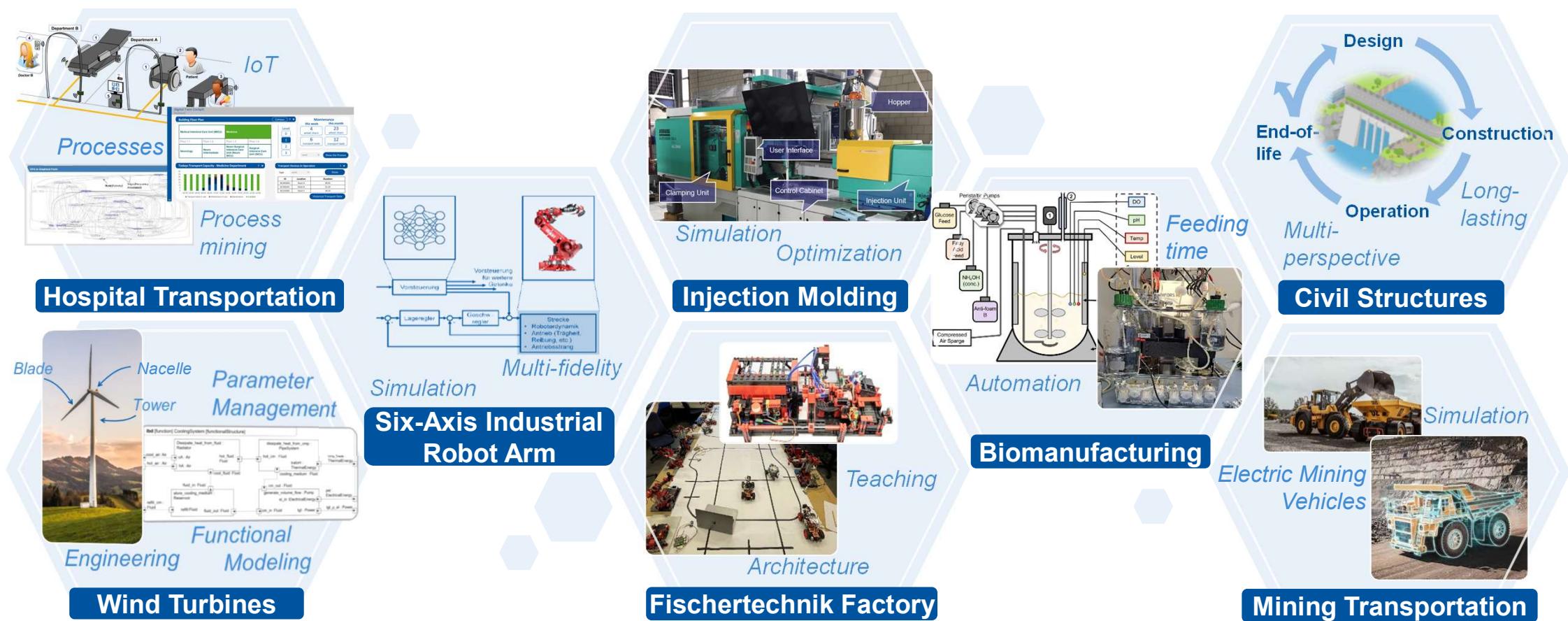
Publication ID	Method type	Geographic scale	Geographic context	Year	Title	Authors	Link
Iacobuta_2021	Mixed (Literature review; Expert judgement)			2021	Transitioning to low-carbon economies under the 2030 agenda: Minimizing trade-offs and enhancing co-benefits of climate-change action for the sdgs	Iacobuță G.I., Höhne N., van Soest H.L., Leemans R.	<a href="#">🔗</a>

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

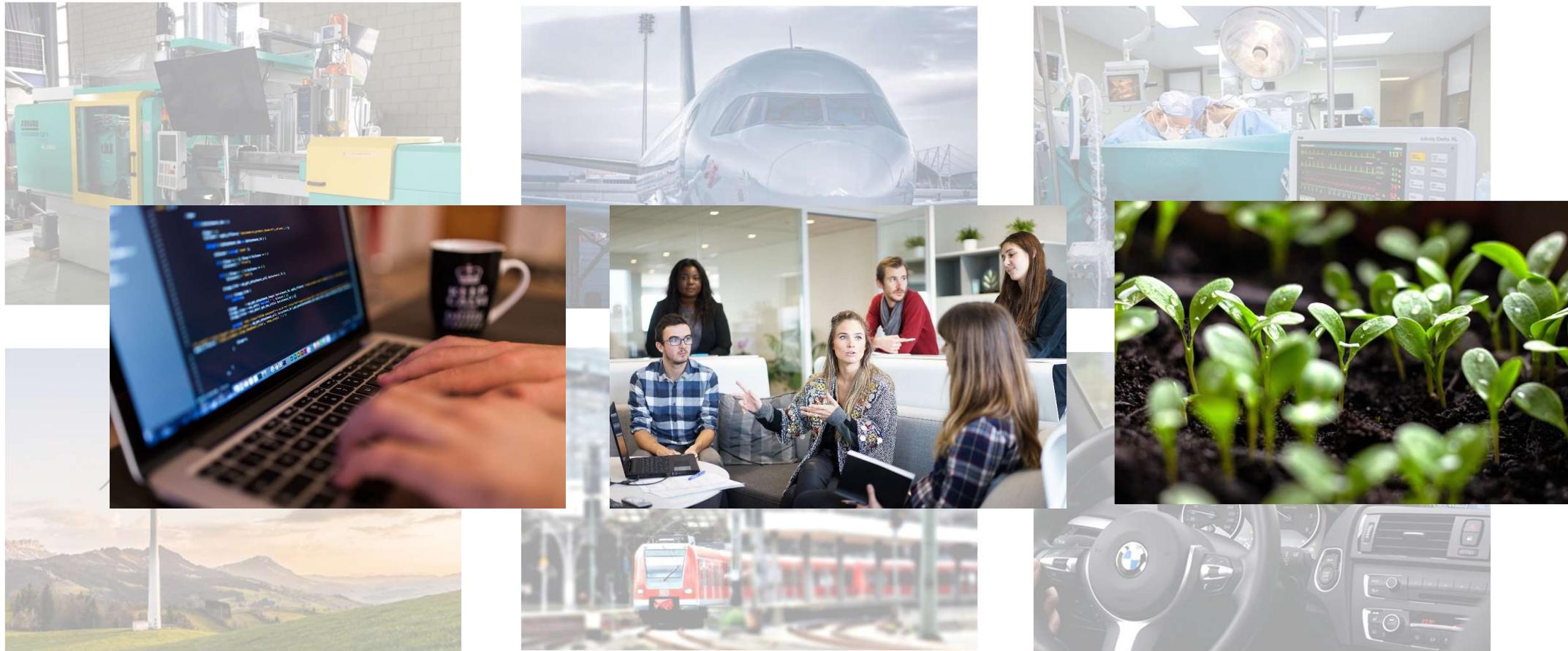
## Digital Twins of Cyber-Physical Systems



## Some Digital Twin Use Cases

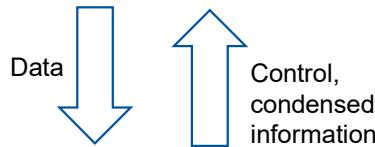


## Digital Twins of Systems

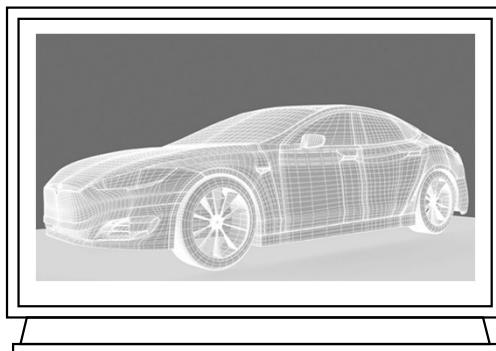


## Digital Twins as complex, long-lasting software systems

Original System



Digital Twin



*contextual data and their aggregation and abstraction*

A Digital Twin of a system consists of

- a set of models of the system and
  - a set of digital shadows,
    - both of which are purposefully updated on a regular basis, and
  - provides a set of services to use both purposefully with respect to the original system.
- 
- The digital twin interacts with the original system by
    - providing useful information about the system's context and
    - sending it control commands.

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

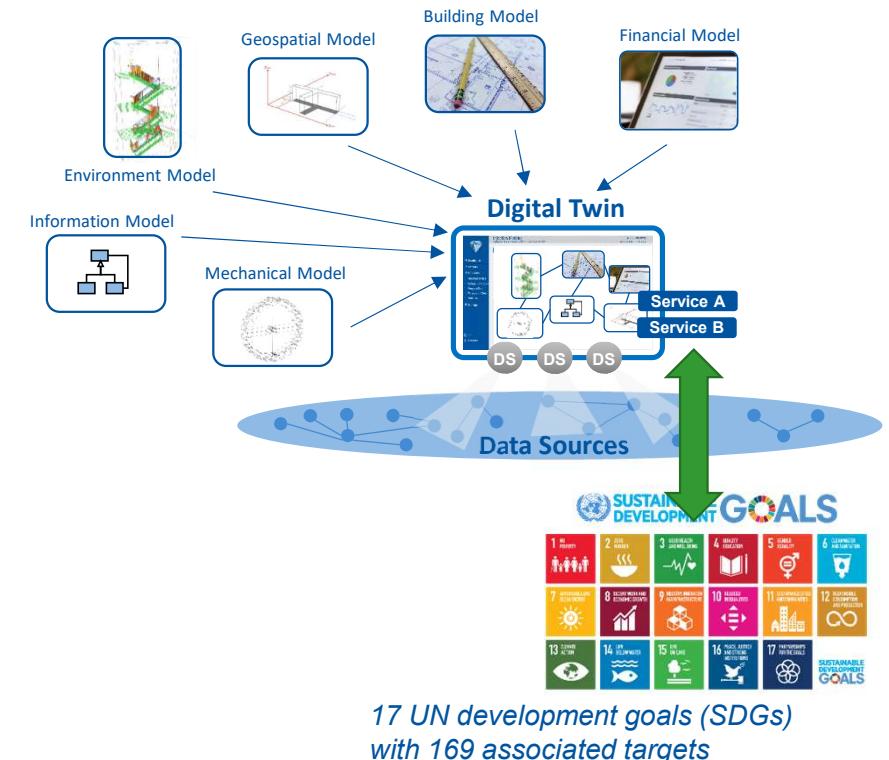




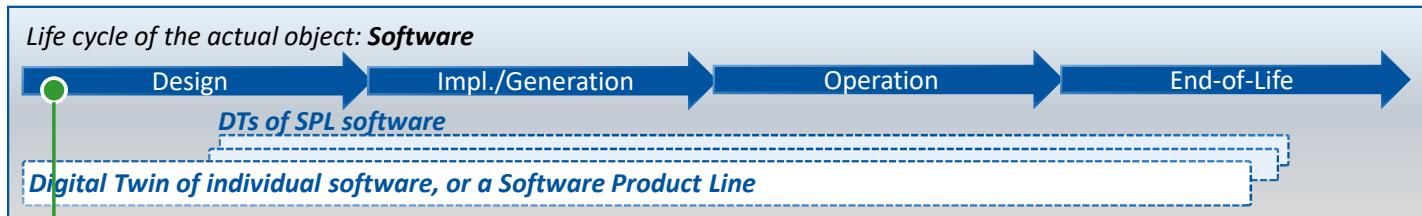
*How can we **use DTs**  
to assess the sustainability of  
complex systems?*

# Digital Twins for Sustainability Assessment

- Engineering 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
- DT services, e.g., in *production*, to
  - enable **simulation** of different *variants* of DTs before building the physical one to **improve resource efficiency**
  - facilitate **optimizing production processes** towards **waste reduction and energy saving**
  - provide **self-adaptability** to improve **resource efficiency**
  - assist with **responsible consumption and use** in relation to created products



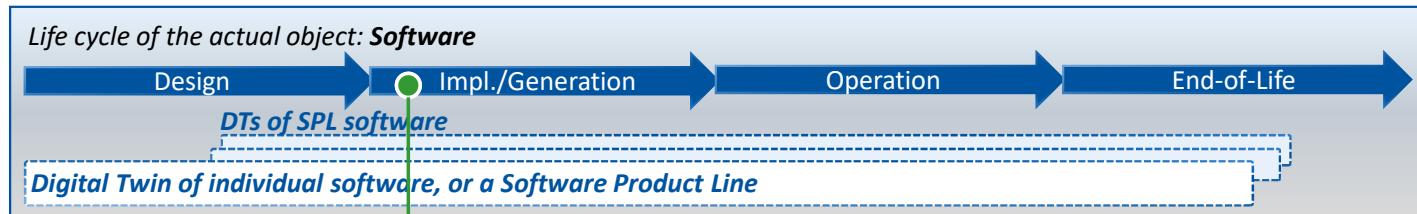
## DT during *design* of a software system



- Services for **analysis of sustainability**
  - architecture model analysis, e.g., optimize consumed resources
  - scenario-based analysis, e.g., resource usage, identify resource-intensive parts
  - ...

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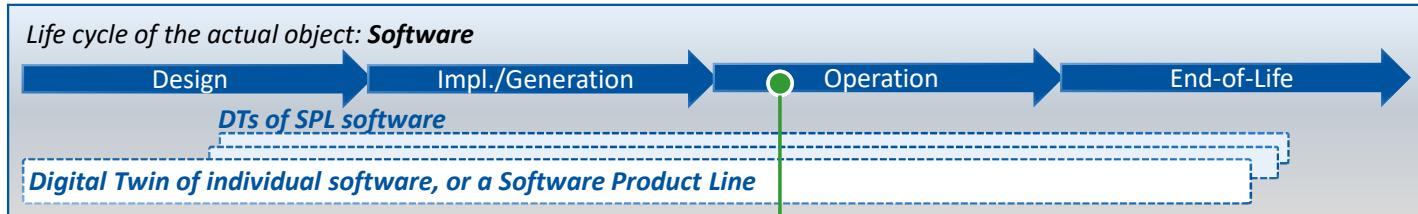
## DT during *implementation/ generation* of a software system



- Creation of **digital shadows**
  - logs of execution sequences, data about resources usage, development processes in tools, source code metrics
- **Services** for
  - identification and optimization of **resource-intensive code sections**
  - analyzing the **development process**, e.g., identify least sustainable parts, bottlenecks
  - ...

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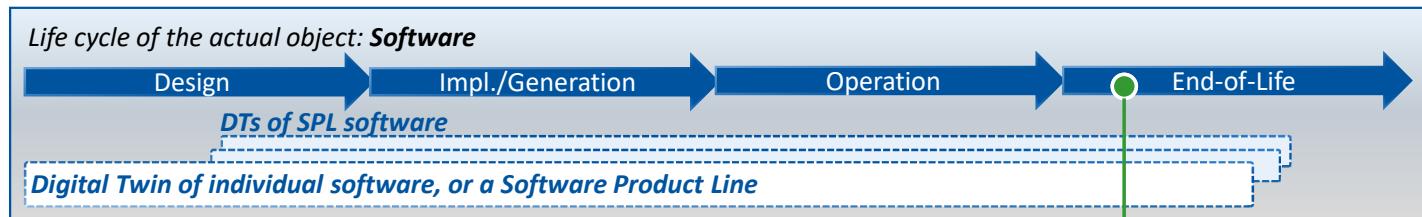
## DT during *operation* of a software system



- Creation of **digital shadows**
  - runtime data of the software system
- **Monitor & report**
- **Analyze** sustainable operation & energy peaks
- **Optimize & intervene** in the software system
  - allocating resource adjusted to the current needs, reconfiguring system parameters, cleanups to guarantee durability
- ...

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



- Draw conclusions about a **component's relevance and reliability in future software systems**
  - compare **planned behavior** in design with **actual behavior** in operation (e.g., process conformance, analyses on error logs)
  - compare **logged energy consumption** with energy goals
  - identify **integration problems** by analyzing test reports
- ...

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# Paper: Digital Twins for Sustainable Software Systems

Digital Twins for Sustainable Software Systems

Malte Heithoff  
Software Engineering  
RWTH Aachen University  
Aachen, Germany  
heithoff@se.rwth.de

Alexander Hellwig  
Software Engineering  
RWTH Aachen University  
Aachen, Germany  
hellwig@se.rwth.de

Judith Michael  
Software Engineering  
RWTH Aachen University  
Aachen, Germany  
michael@se.rwth.de

Bernhard Rümpe  
Software Engineering  
RWTH Aachen University  
Aachen, Germany  
rümpe@se.rwth.de

**Abstract**—Sustainable software systems aim to create resource-efficient software products and reduce the carbon impact of applications. Current approaches for sustainability assessment of software are either only focused on their operation or rely on methods in their engineering. More holistic approaches for sustainable software system engineering are missing. Thus, we argue that the integration of the engineering of software systems together with the monitoring of their sustainability goals over their whole lifetime. Within this paper, we suggest using digital twins for this purpose. We introduce the concept of digital twins with a specific focus on using model-driven engineering methods for the creation of applications. We can generate accompanying digital twins which are able to monitor the operation of the system and provide services for the assessment of sustainability indicators. In the long run, this provides us with better assessment for the engineering of sustainable software systems.

**Index Terms**—Model-Driven Engineering, Digital Twins, Sustainable Software Systems

## I. INTRODUCTION

When technical developments are considered in terms of their social, economic, and environmental aspects of sustainability [1] they should have a positive impact on our world. To achieve this impact, the United Nations developed 17 sustainable development goals (SDGs) with 169 associated targets [2]. Translating these goals to software systems is still a challenge. Pernerstorfer [3] defines sustainability “as assessing 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 perspectives:

- Development processes: This includes software engineering processes with responsible use of ecological, human, and financial resources.
- System maintenance: This includes the maintenance and evolution of a software system with minimized environmental impact, well-managed knowledge, and sufficient economic balance.
- System production: In this perspective the software is considered a product perspective including its hardware and the resources needed for production.
- System usage: Here we take the entire period of use of the software and its operational environment into account.

There exists a large variety of metrics to assess green software [4]. Venter et al. [5] suggest considering software sustainability in a more systematic manner. Measuring the extensibility, interoperability, maintainability, reliability, reusability, scalability, and usability of a system enables us to make statements about its sustainability. This allows analyzing, evaluating, and reasoning about sustainability at an architectural level [5]. Kern et al. [6] describe causal chains engineering for CPSs [7] to reason about impacts on natural resources, e.g., energy. Design choices in software engineering, e.g., which programming language to use, compiler optimization, and implementation choices, have an influence on the energy efficiency of programs [10].

*Digital Twins*. We suggest using DTs to accompany software systems in all life cycle phases to support their sustainability

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*Digital Twins of software systems to support the sustainability assessment of applications*

- ...more in the paper

## • Further research

- How to model sustainability metrics?
- What services are helpful for developers?



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



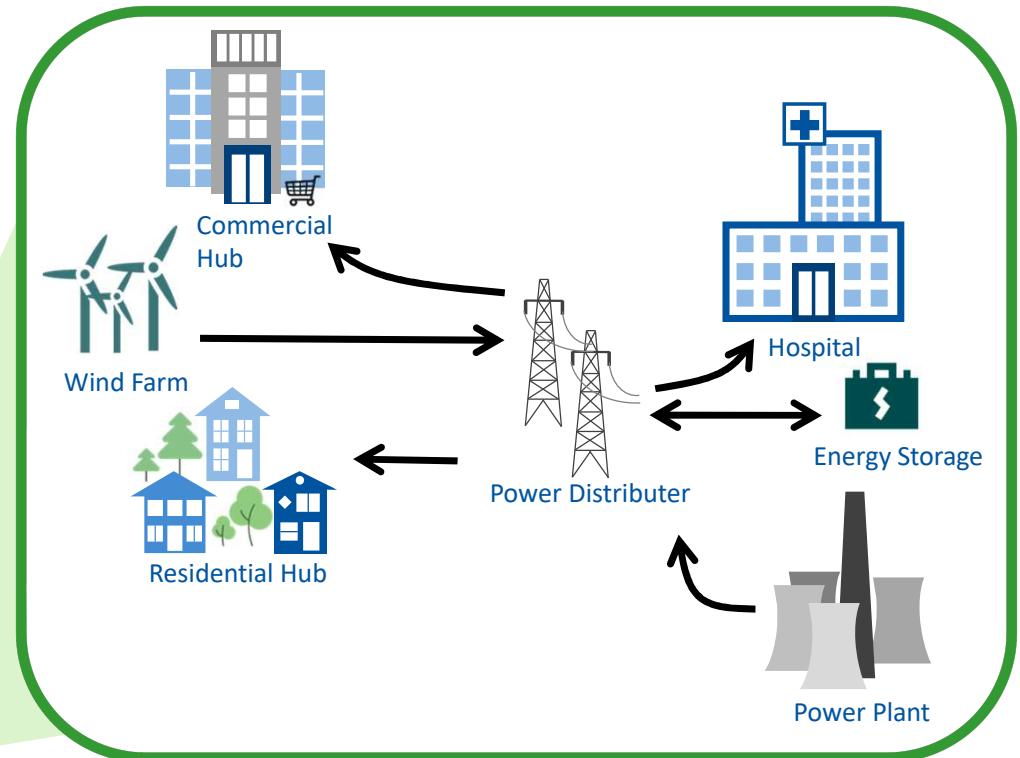
# Sustainable Evolution of Systems

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?*

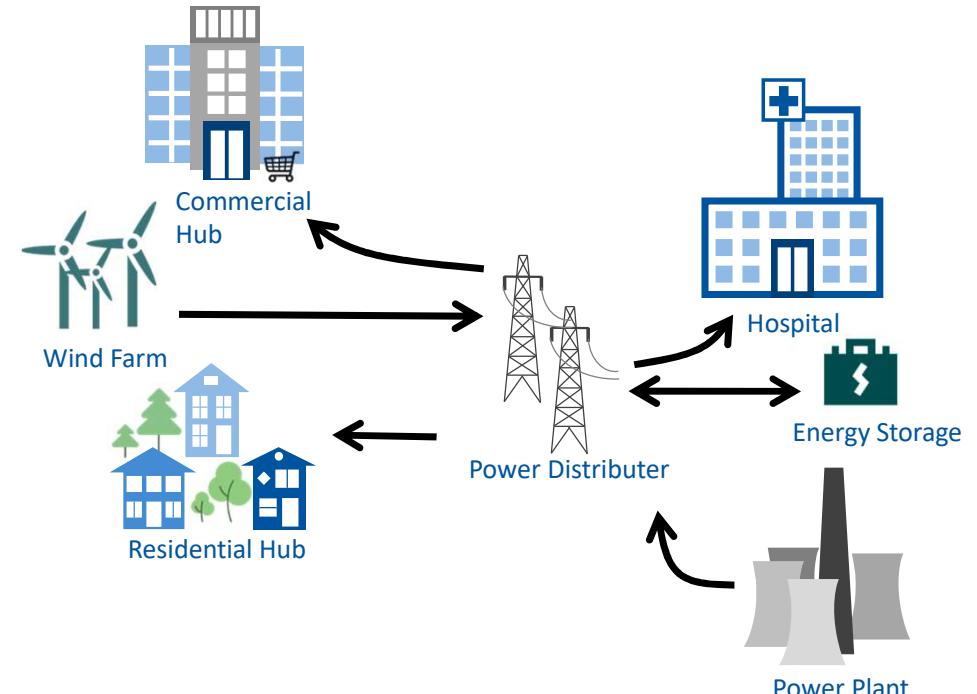


[GKM+23] G. Gramelsberger, H. Kausch, J. Michael, F. Piller, F. Ponci, A. Praktikno, B. Rümpe, R. Sota, S. Venghaus: Enabling Informed Sustainability Decisions: Sustainability Assessment in Iterative System Modeling. In: ME Workshop @MODELS, 2023.

## Sustainable Evolution of Systems

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

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

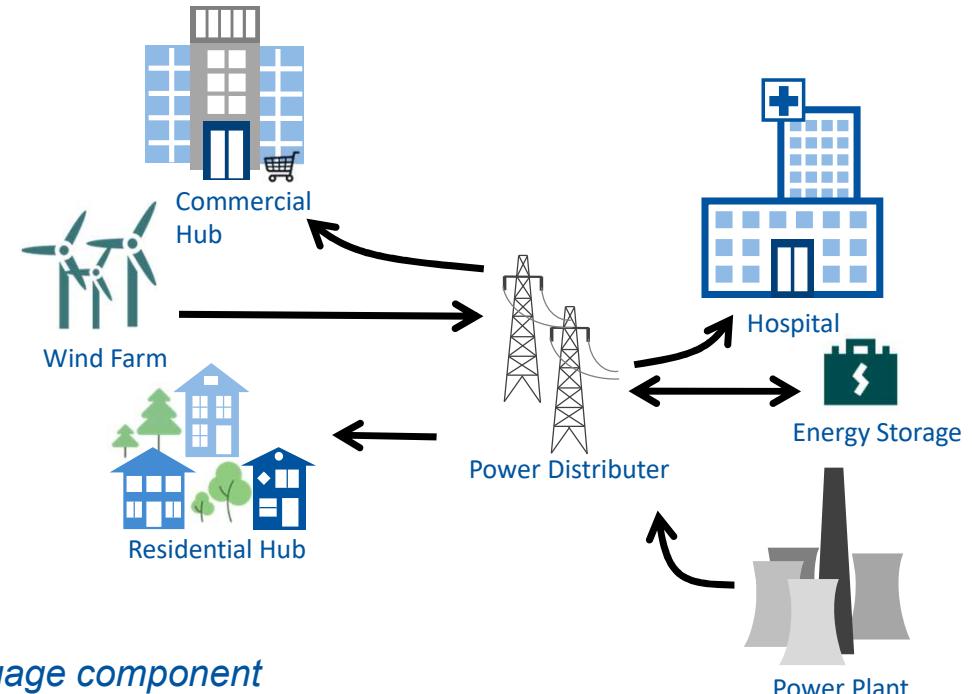


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## Sustainable Evolution of Systems

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

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



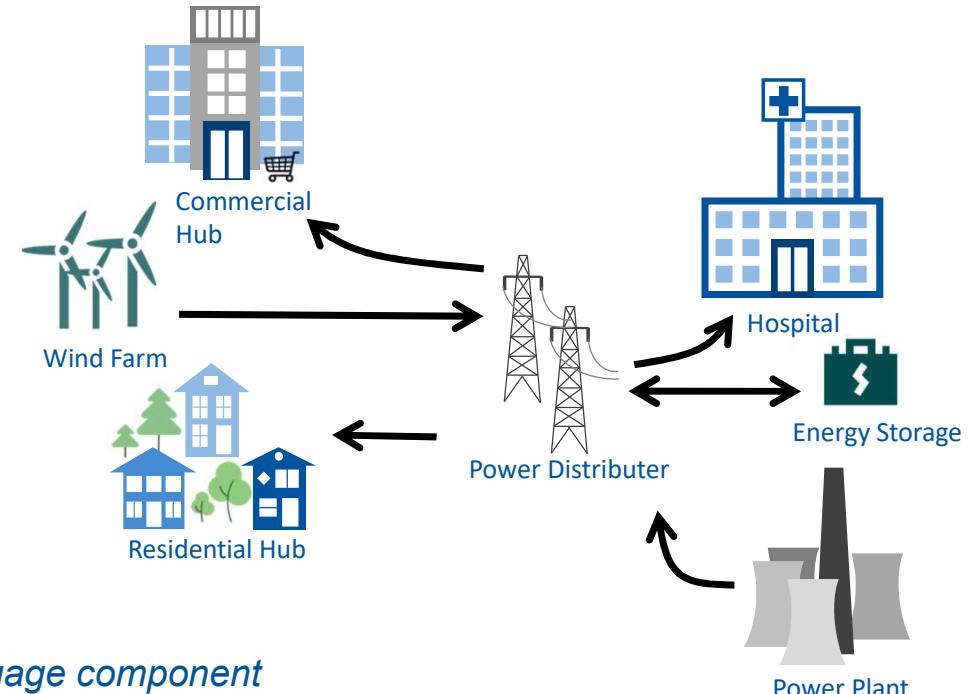
- *SDG language component*
  - Which sustainability goals to achieve?
  - DSL library: domain-specific indicators for energy planning

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# Sustainable Evolution of Systems

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

```
1 component CoalPowerplant{           MA
2   port
3     out ElectricalEnergy ee;
4
5   sustainability{
6     type: energy, structure, process;
7     indicators{
8       consumption: coal;
9       co2Emission: 950 gCO2/kWh;
10      landscapeUsage: 1km^2;
11      ...
12    }
13  }
14 }
```



- *SDG language component*
  - Which sustainability goals to achieve?
  - DSL library: domain-specific indicators for energy planning

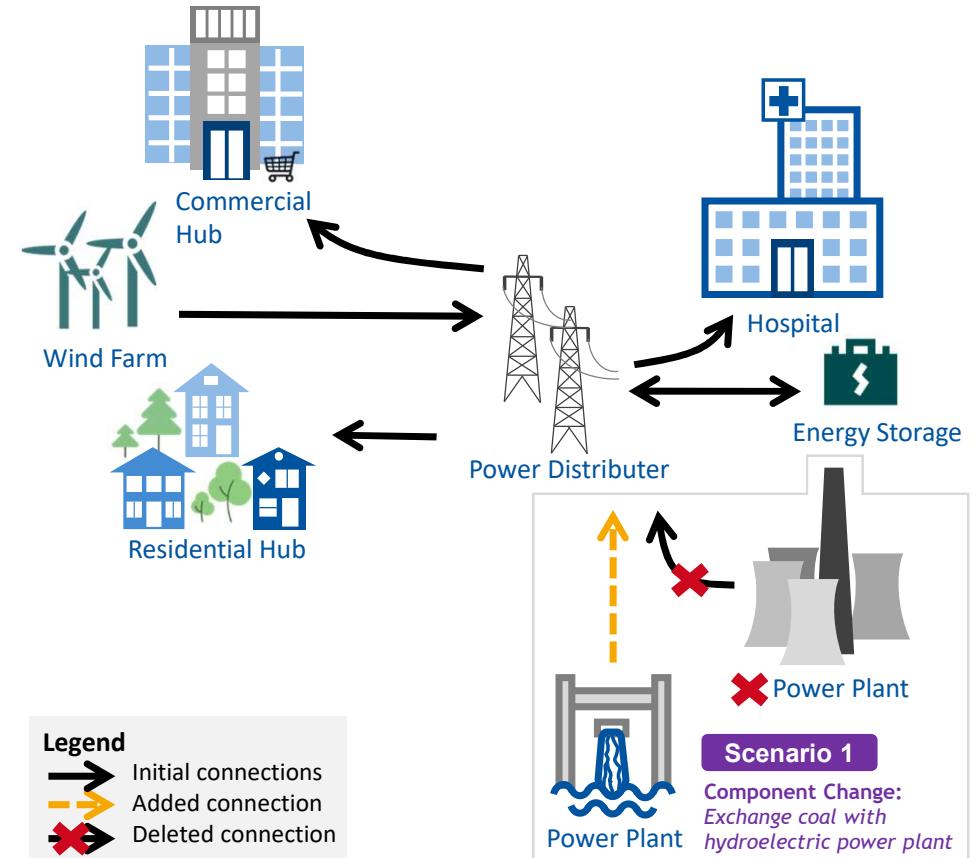
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# Sustainable Evolution of Systems

- Evolution Scenario 1 | Component Change
  - Black-box architecture is unchanged

```
1 component HydroPowerplant{           MA
2   port
3     out ElectricalEnergy ee;
4
5   sustainability{
6     type: energy, structure, process;
7     indicators{
8       consumption: renewable, hydro;
9       co2Emission: 24 gCO2/kWh;
10      landscapeUsage: 2km^2;
11      ...
12    }
13  }
14 }
```

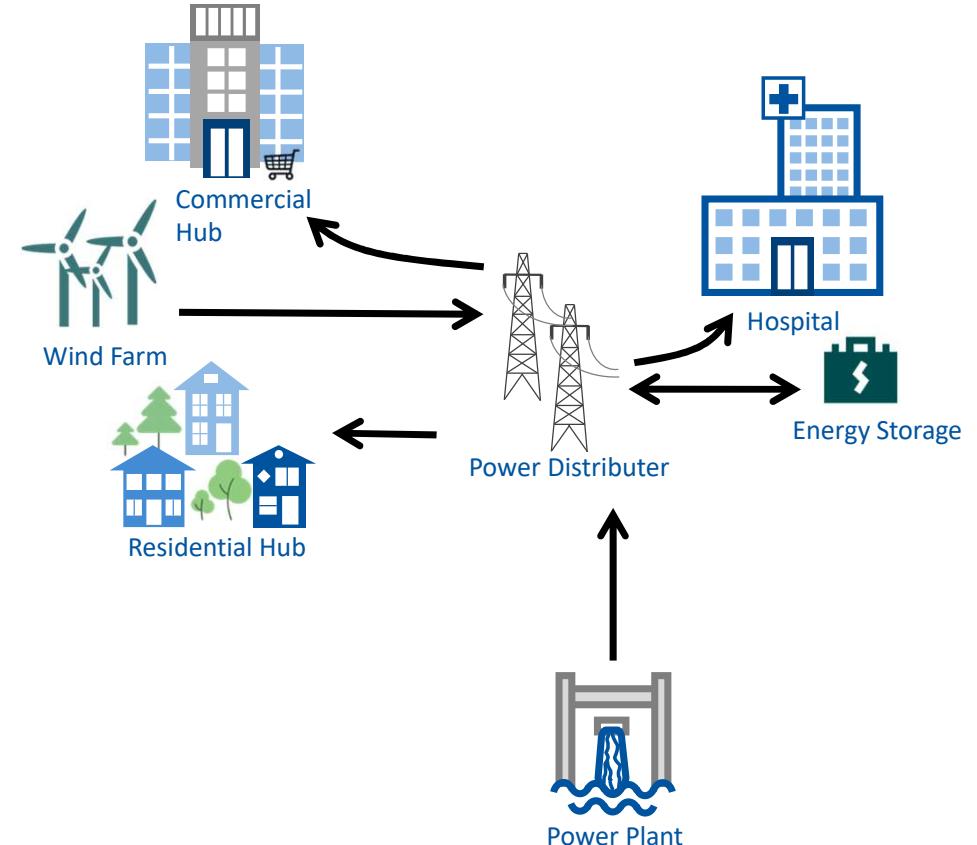


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## Evolution Scenario 1 | Component Change

- **Assessment Result**
  - Reduced the power plant's CO<sub>2</sub> emissions by over 95%
  - More landscape usage
  - Slightly positive effects for SDGs 7, 11, and 13

- **Sustainability Assessment**
  - assessed by experts or
  - passed on to assessment systems
    - domain-specific systems
    - *Sustainability Evaluation Experience R* (SEER) [KMC+20]



[KMC+20] 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.

# Sustainable Evolvement of Systems

Enabling Informed Sustainability Decisions:  
Sustainability Assessment in Iterative System  
Modeling

Gabriele Gramelsberger <i>Faculty of Science and Technology RWTH Aachen University gramelsberger@humtec.rwth-aachen.de</i>	Hendrik Kausch <i>Software Engineering RWTH Aachen University kausch@sc.rwth.de</i>	Judith Michael * <i>Software Engineering RWTH Aachen University michael@sc.rwth.de</i>
Frank Piller <i>Technology and Innovation Management RWTH Aachen University piller@timc.rwth-aachen.de</i>	Ferdinanda Ponci <i>E.ON Research Center at RWTH Aachen University fponci@concrec.rwth-aachen.de</i>	Aaron Praktiknjo <i>E.ON Research Center at RWTH Aachen University apraktiknjo@concrec.rwth-aachen.de</i>
Bernhard Rumpf <i>Software Engineering RWTH Aachen University rumpf@sc.rwth.de</i>	Rega Sota <i>School of Business and Economics RWTH Aachen University regasota@soccon.rwth-aachen.de</i>	Sandra Venghaus <i>School of Business and Economics RWTH Aachen University venghaus@soccon.rwth-aachen.de</i>

**Abstract**—When planning, creating, and evolving systems throughout their life cycle, it is important to assess their impact on our world. Despite this, there is a need for more structured methods for systematically assessing social, economic, and environmental impacts like those related to targets of the United Nations' sustainable development goals. Moreover, existing methods for sustainability assessment are often not well suited for the engineering and design of a domain-specific language for sustainability assessment embedded into ADLs and showcases its use for evaluating a citizen energy community system as a case study. We describe our work on how to extend such models in their further processing and explore challenges in technical realization. This is a first step towards standardizing the sustainability assessment of modern systems, thereby ensuring development is both comprehensive and formal so that developers can make informed, sustainable decisions based on consequence analysis up-front.

**Index Terms**—Systems Engineering, Domain-Specific Languages, Model-Driven Engineering, Sustainable Development Goals, Life-Cycle Sustainability Assessment, Architecture Description Language, Energy Planning

## I. INTRODUCTION

**Motivation.** When developing and evolving systems, technologies, and processes over a longer period of time sustainability 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 pure software systems. Development decisions may lead to

\*Corresponding author.

## II. PRELIMINARIES

**Architecture Description Languages.** For modeling systems, ADLs [1] offer a formal notation for iterative development. Most ADLs follow a component-centered approach, where a system architecture is defined by its components/parts and their connectors/ports. Often, additional behavior description possibilities are offered for atomic components through language compositions, e.g., state charts [4]. Components define their communication interface through input and output ports.

*Facilitate the sustainability decision-making  
throughout the lifecycle of systems  
by embedding sustainability descriptions in ADL models*

... more in the paper!



To the  
**Preprint**  
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[GKMc+23] G. Gramelsberger, H. Kausch, J. Michael, F. Piller, F. Ponci, A. Praktiknjo, B. Rumpf, 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:

- 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.

# Next Generation Sustainability

- *Interdisciplinary* research group from *RWTH Aachen*
  - *Mechanical Engineering*: Manufacturing Technology, Advanced Mining Tech., Anthropogenic Material Cycles, Textile Tech., Industrial Eng. and Ergonomics
  - *Energy Engineering*: Aut. of Complex Power Syst., Energy Syst. Economics, Sustainability in Civil Eng., Tech. Thermodynamics
  - *Informatics*: Software Engineering, Databases, Computer Graphics & Multimedia, HPC, Comm. and Distributed Syst.
  - *Chemistry, Geographics*: Bioinorganic Chemistry, Geography, Comp. Geoscience, Geothermics and Reservoir Geophysics
  - *Business Administration*: Applied Economics, Planning Theory, Controlling, Technology & Innovation Management
  - *Social Science*: Human Tech. Center, Philosophy of Science and Tech., Decision Analysis and Socio-economic Assessment, Computational Social Science
- Developing a holistic approach for *sustainability assessment* aiming to cover all UN SDGs

## Next Generation Sustainability

A RWTH Research Group aiming at integrating societal, ecological, and economic sustainability.



- Sustainability assessment of *technologies, products, and policies*
  - Different *levels of analysis*, e.g., global, national, regional, industry, product-level
- Participatory *open science* approach
  - open-up the development for stakeholders worldwide

<https://nextgen.rwth-aachen.de>



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



Illustration by Ricardo Tronico

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



About Working Groups Projects Resources Articles



## 10 RECOMMENDATIONS FOR GREEN SOFTWARE DEVELOPMENT

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

Forbes

FORBES > INNOVATION

## The Power Of Sustainable Software



Alexander Belokrylov Forbes Councils Member

Forbes Technology Council COUNCIL POST | Membership (Fee-Based)

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 *less-power-consuming ML models*
- Monitor *real-time power consumption* during development



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

# Sustainable Software Engineering

- Six principles for Sustainable Software Engineers**
- Carbon, Electricity, and Hardware Efficiency when building applications
  - Carbon Awareness: Consume electricity with the lowest carbon intensity
  - Measurement to improve sustainability
  - Climate Commitments: Defining the exact mechanism of carbon reduction

Source: <https://learn.microsoft.com/en-us/training/modules/sustainable-software-engineering-overview/>

## Human Sustainability in SE

- Impact sourcing
- Ethical outsourcing
- Fair trade software

Ramautar, V., Overbeek, S., Espa  a, S. (2021). Human Sustainability in Software Development. In: Calero, C., Moraga, M.  , Piattini, M. (eds) Software Sustainability. Springer



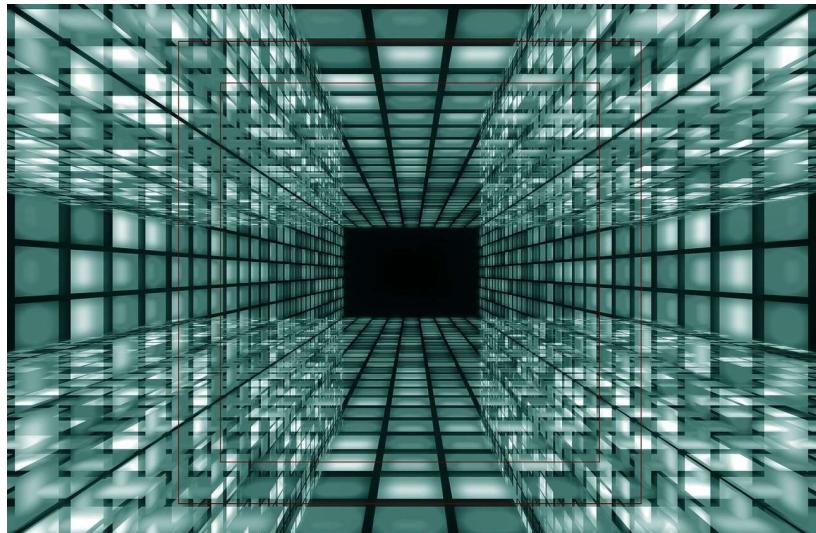
# Sustainable Software Engineering

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**Sustainability is** “preserving the function of a system over a defined time span”

- 3 variables: system, function, and time

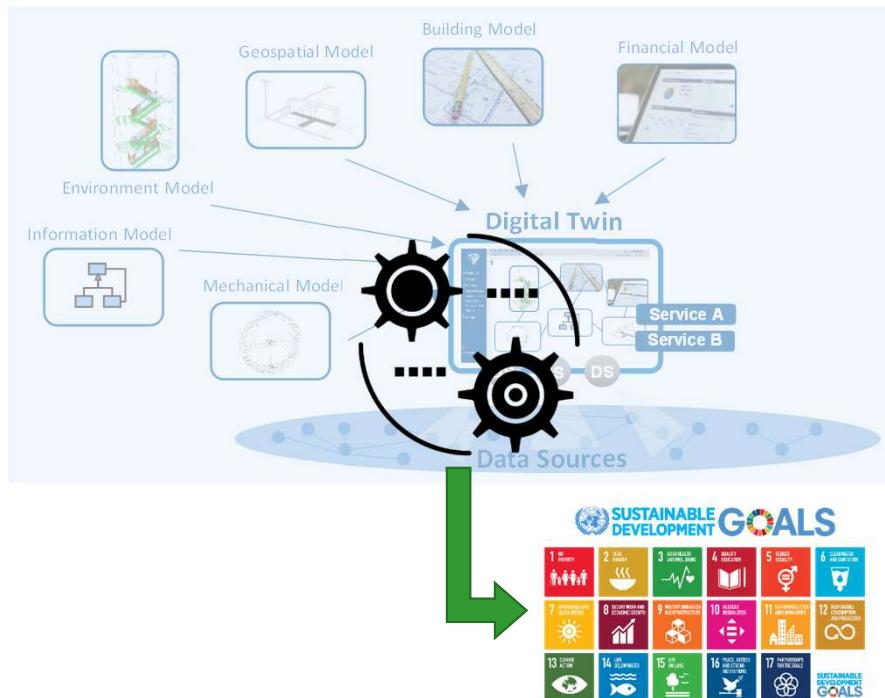
B. Penzenstadler, “Towards a definition of sustainability in and for software engineering,”  
In ACM Symp. on Applied Comp. (SAC), 2013.



## 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*

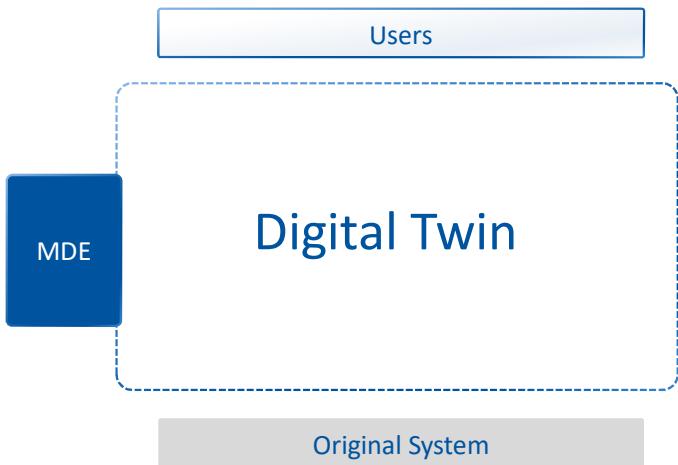
- Digital twins can be **sustainably developed**
  - Apply practices used for other software systems

*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?

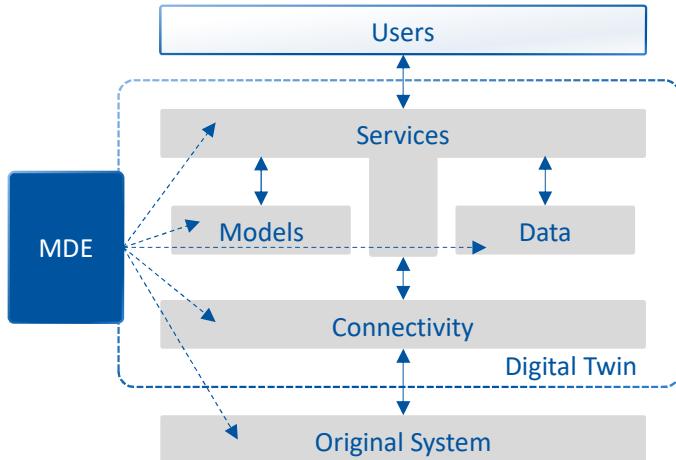
## Model-Driven Engineering of Digital Twins | Benefits

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- 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
- ...

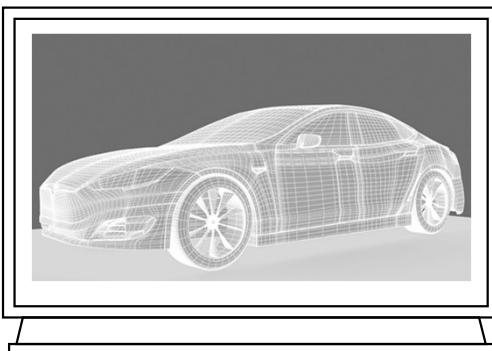
## MDE of Digital Twins | Where and how to consider sustainability?



- **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

Original System



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?
- *Composition/ Federation of DTs*
  - How to compose DTs to improve maintainability?
  - What are the costs of federation vs. integration?
- *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

*Finding balances is not easy!*

# Model-Based DevOps project

Automate the *DevOps cycle* by leveraging digital twins and model-based development



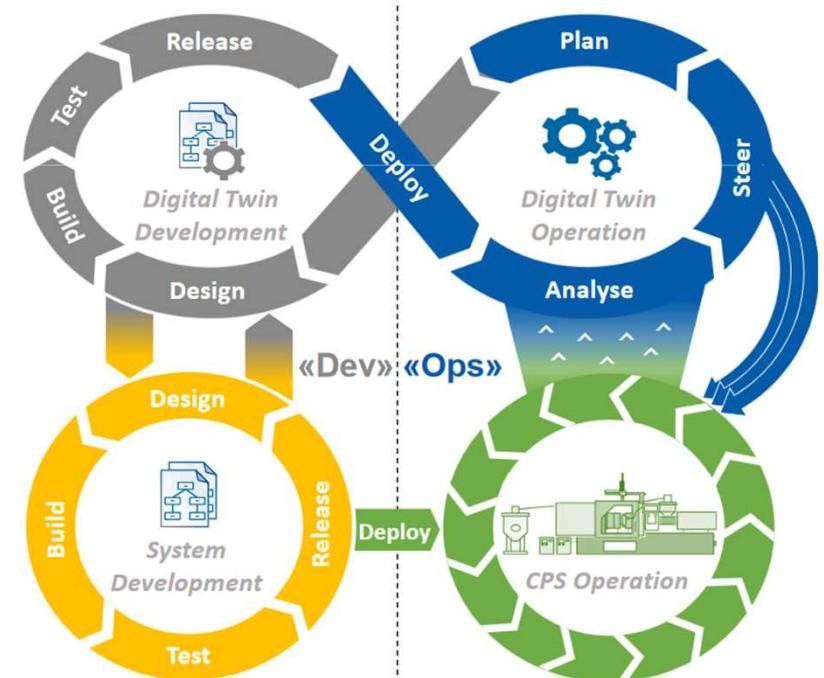
with Université de Rennes & Universität Stuttgart

Application Domain: *Sustainable Production*

## Research Goals

- Composability of Digital Twins
- Definition of a *Reference Model* of Digital Twins and Data Models
- Improving the *Modeling of Ops and Dev Activities*
- Establishing the *Dev-to-Ops-to-Dev Modeling Continuum*
- Automatically *Synthesizing Dev-to-Ops-to-Dev Models*

More: <https://mbdo.github.io/>



[CJP+23] B. Combemale, J. Jézéquel, Q. Perez, D. Vojtisek, N. Jansen, J. Michael, F. Rademacher, B. Rumpe, A. Wortmann, J. Zhang: *Model-Based DevOps: Foundations and Challenges*. In: ModDiT Workshop at MODELS 2023



*"What you do makes a difference,  
and you have to decide what kind  
of difference you want to make."*

*Jane Goodall*

## ***LET'S MAKE A DIFFERENCE!***

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

Feel free to contact me:

✉ [michael@se-rwth.de](mailto:michael@se-rwth.de)

☞ [@judithmichael.bsky.social](https://@judithmichael.bsky.social)

Ⓜ [@JudithMichael@mastodon.acm.org](https://@JudithMichael@mastodon.acm.org)

🐦 X [@JudithMichael\\_](https://@JudithMichael_)

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