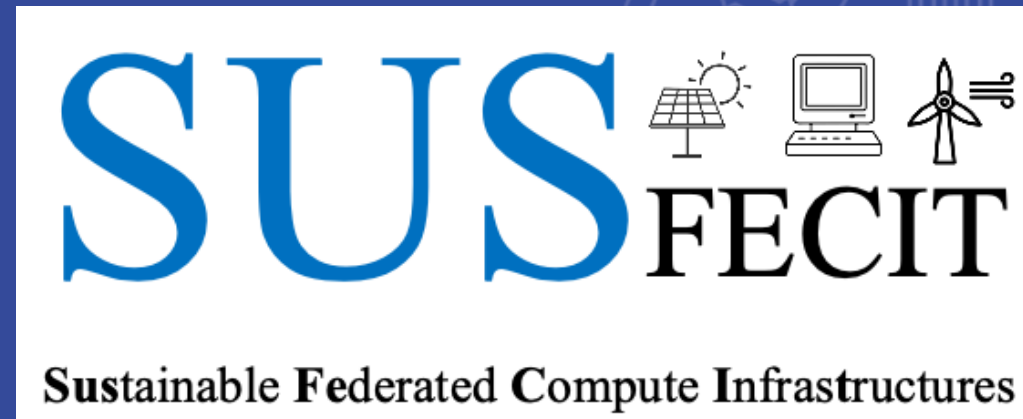


# Advancing the Environmental Sustainability of Scientific Computing for ErUM



Markus Schumacher  
on behalf of the proposed SUSFECIT Research Network  
(Aachen University, Bonn University, DESY, Freiburg University, Göttingen University, KIT, Öko-Institut e.V.)

2nd ErUM-Data Workshop on Sustainability  
Aachen, 29.7. 2025

**Hopefully**

With funding from the:



# The proposed Consortium

## Partners



Achim Stahl



Martin Gasthuber



Philip Bechtle



UNIVERSITÄT  
GÖTTINGEN  
Arnulf Quadt



Manuel Giffels



**Öko-Institut e.V.**  
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## Associated Partners



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Erik Bründermann  
Achim Streit  
Kathrin Valerius



Christian Gutt



BERGISCHE  
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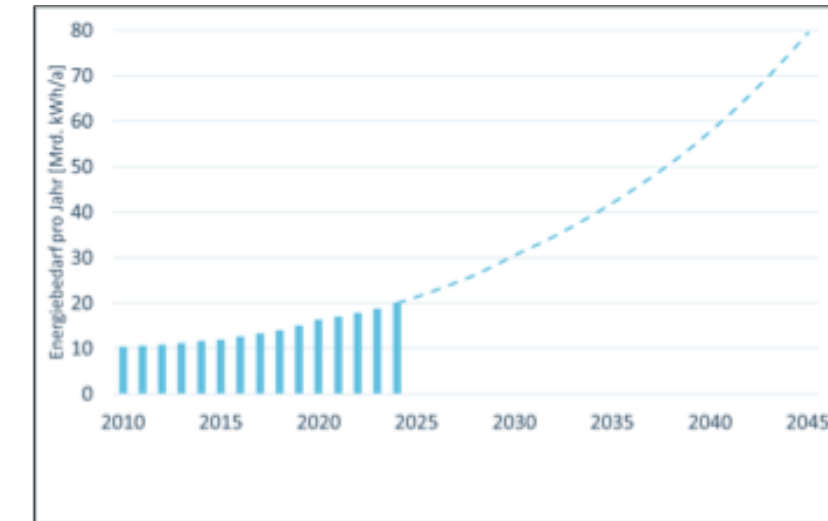
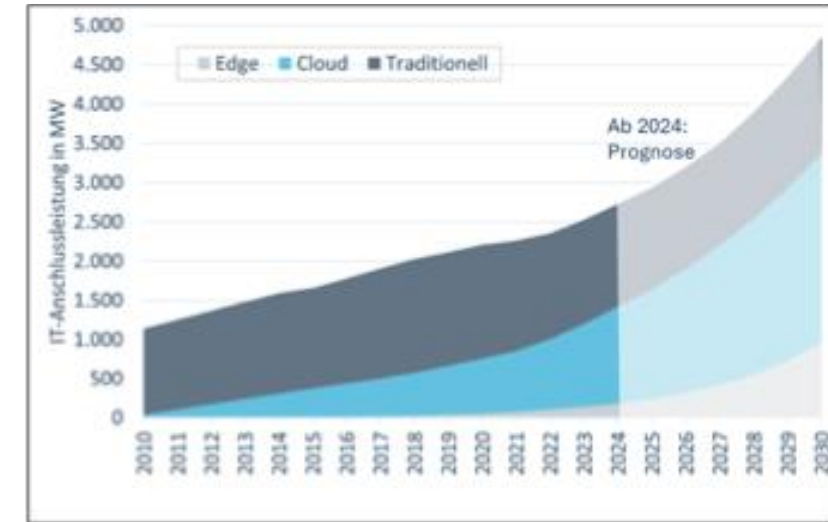
# Energy Consumption, CO<sub>2</sub> footprint of Compute Centres in D in 2024

- Electricity demand of compute centres is increasing.
- In Germany ~ 20 billion kilowatt hours in 2024, corresponds to ~ 3.9 % of total German electricity consumption.
- We expect this to double in the next 4 to 5 years (Felix, Behrens, Öko-Institut)
- In 2024, an average of 363 gr of CO<sub>2</sub> were emitted per kWh of electricity consumed in Germany during generation (386 (433) gr/kWh in 2023 (2022) ) (Source: Umweltbundesamt)

→ CO<sub>2</sub> footprint by compute centres: 7.28 Mt CO<sub>2</sub> in 2024

- Compare:  
Germany in total 649 Mt (CO<sub>2</sub>)<sub>eq</sub> (572 Mt CO<sub>2</sub>, energy industry 177 Mt CO<sub>2</sub>) (Umweltbundesamt)
- Goal of CO<sub>2</sub> neutrality in 2045 in Germany and 2050 in EU

→ Advance environmental sustainability of scientific computing



Stand und Entwicklung des Rechenzentrumsstandorts  
Deutschland ,Gutachten im Auftrag des BMWK  
BMWK-Projekt-Nr.: 115/21-45

# The Basic Idea of SUSFECIT

**Sloppy:** „Perform calculations when and where sun is shining or wind is blowing“

**SUSFECIT**

Sustainable Federated Compute Infrastructures

## ➤ A bit more precise:

Adapt the amount of calculations and energy consumption to the temporal and local availability of renewable energies (RE) to be used in compute centres e.g. exploit that compute jobs are “easily” dispatchable in time and space

## ➤ Means of adaption:

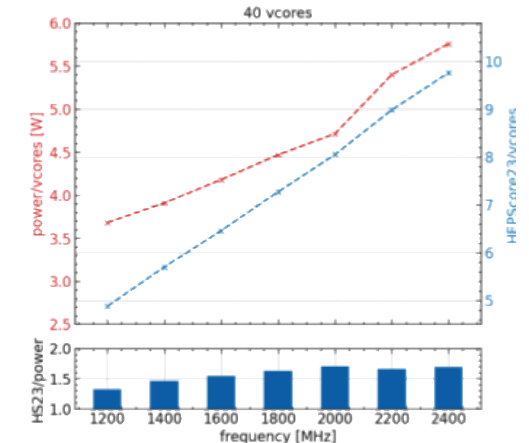
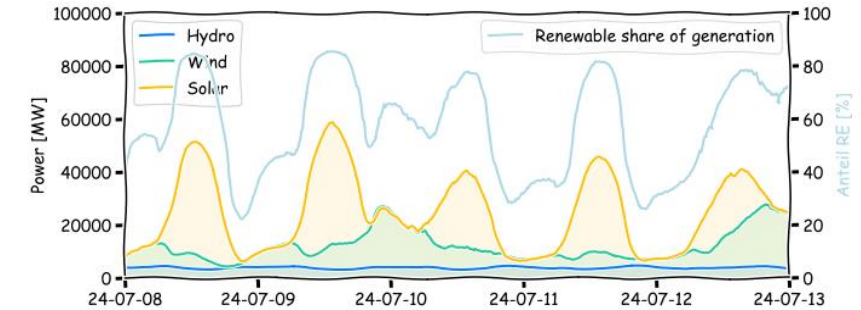
- shut down (parts) of cluster
- reduce clock frequency of CPUs (GPUs)
- transfer jobs to sites where enough RE is available

## ➤ Requirements on hardware:

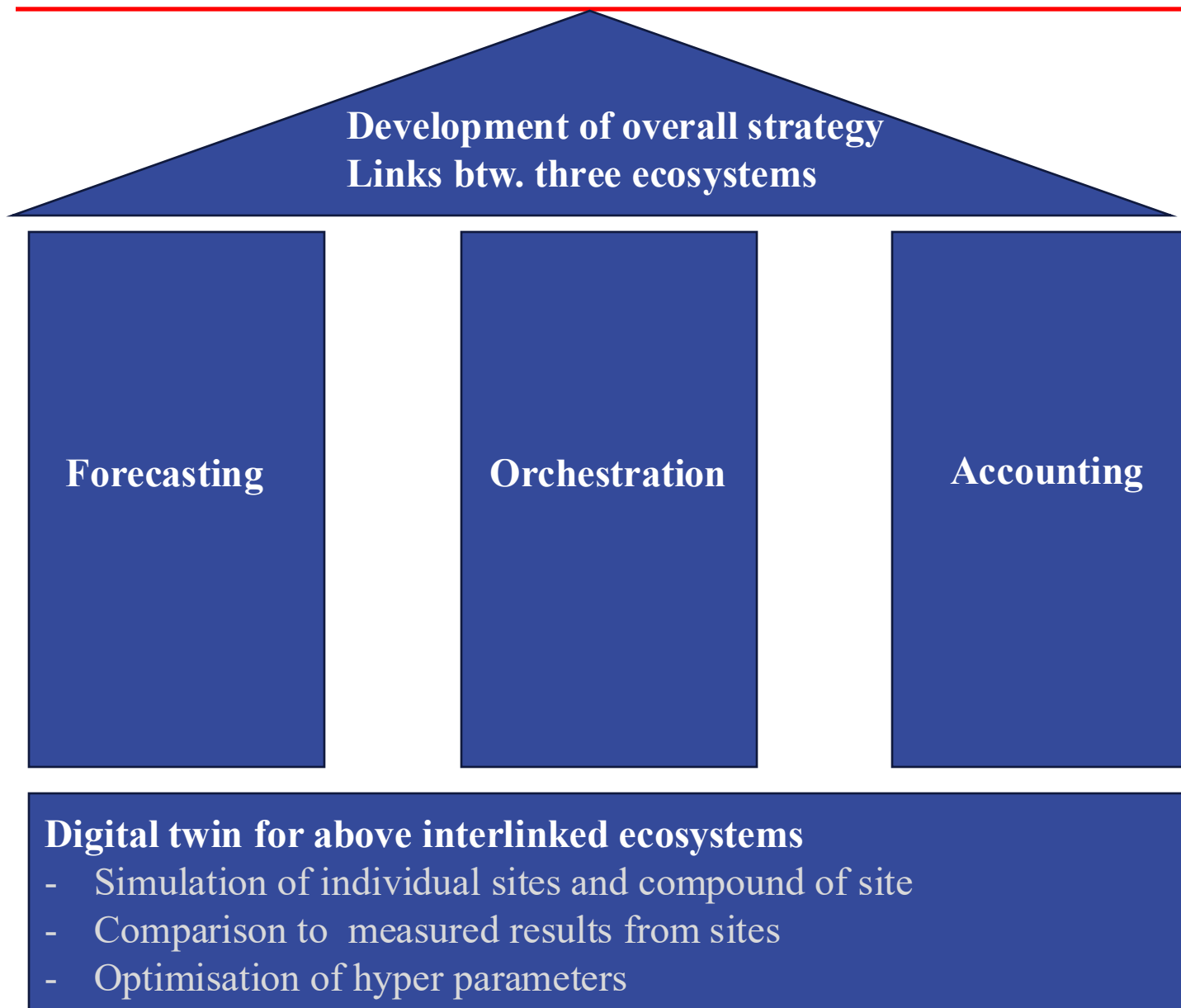
- overprovisioning of resources to compensate for volatility of RE and dark doldrums
- include energy storage (in/close-by compute centres) in concept to compensate for volatility of RE and dark doldrum (→ see presentation by Achim Stahl)

## ➤ Requirements on strategy of operation/ software ecosystems:

- Forecast of available RE with good temporal and local resolution (and requested compute time)
- Orchestration of jobs in time and on compound of sites according to available RE and compute demands (incl. check pointing for transfer of jobs between sites)
- Accounting of elapsed time, consumed energy, produced CO<sub>2</sub> footprint (incl. LCA, used water, ...)



# The „House“ of SUSFECIT



## Goals:

- Increase the environmentally sustainable use and operation of compute resources.
- Raise awareness of the impact of scientific computing on the CO<sub>2</sub> footprint
- Train talented early career scientists in cutting-edge technologies

## Dissemination:

- First developed and deployed for ATLAS, CMS and ET
- Later:
  - KATRIN, XENONnT, LXZD (neutrino and astro-particle physics)
  - Experiments at PETRA-III, EU-XFL, ESRF (synchrotron radiation physics)
- Perhaps: Further use cases identified

Links to PUNCH4NFDI, EOSC, WLCG via partners and associated partners

Associated partner will act as critical reviewers, alpha-users and multipliers 4



First studies toward optimized operation of compute infrastructure performed.

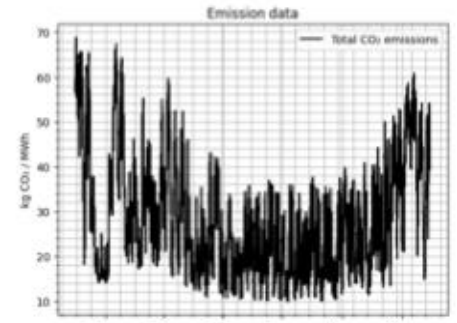
- Taking into account temporal availability of renewable energies (RE), time dependent energy price, network costs, embedded CO<sub>2</sub> in hardware, ....
- First optimized values for replacement of hardware, thresholds for shutdown / throttling of hardware w.r.t. minimal total costs or minimal total CO<sub>2</sub> footprint.

## Forecasting:

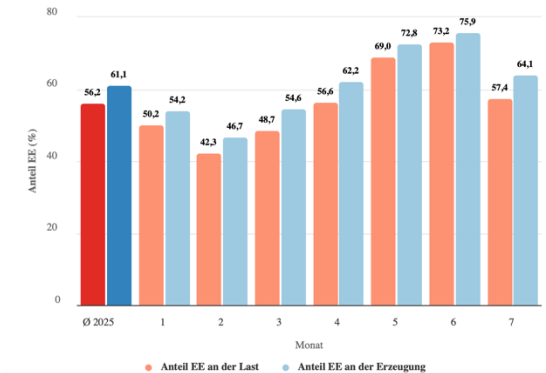
decide whether in upcoming time window energy consumed by scheduled compute jobs can be covered by sufficient RE (from variable sources such as wind and sunshine) and how expensive energy is (depends on the residual load)

## Optimization for overall CO<sub>2</sub> footprint (and/or lowest total investment):

- operation of a given set of compute centres to be optimized for the given amount of RE
- overprovisioning of resources to compensate for down times due to low RE
- full LCA of machines and infrastructure (storage, local photovoltaic, ...)

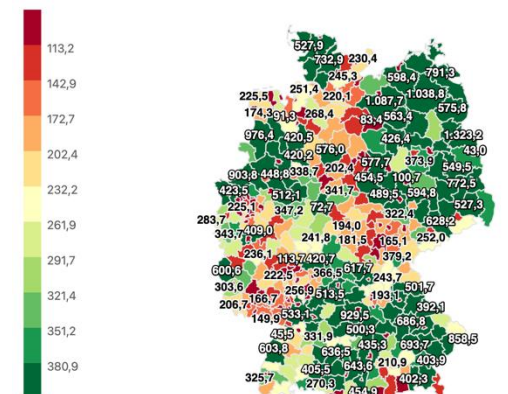


Energetisch korrigierte Werte - bis 28.07.2025, 09:30 MESZ



## Installierte Solarleistung in Deutschland in 2025

Werte in MWp – Gesamtsumme: 108.352 MWp



## Steps of implementation:

- Creation of data base for available RE (initially w/ coarse local and temporal resolution)  
e.g. using energy-charts.info, and information from hardware suppliers and first model for forecasting
- Initial operability and interfacing to AUDITOR, the digital twin
  - Develop algorithms for automatically deciding how to dispatch resources at any given time, taking into account the load of requested and queued compute jobs and the availability of RE
  - Decision transferred to COBaD/TARDIS and AUDITOR and incorporation of developed tools in „Digital twin“
  - Simulation of one year of running on federated resources
  - Use evaluation and feedback-loops to continuously optimize set-up
- Extension to further sources of CO<sub>2</sub>  
Based on eco-digit project (Öko-Institut et al.) development and optimization of the forecasting methodology taking into account e.g. embedded CO<sub>2</sub> in the hardware, procurement and disposal, etc. (→ see talk by Martin Möller)
- Towards CO<sub>2</sub>-neutral operation with local energy storage (for ET) (→ see talk by Achim Stahl)  
Evaluation of the potential to reach a fully CO<sub>2</sub>-neutral operation based on local energy storage and local RE production  
Breathing centre powered by wind & solar energy plus use battery and hydrogen storage to cover the base load of the centre during periods of low availability of RE

# Orchestration (lead & coordinated by KIT, M. Giffels; partners: BN, DESY, GÖ, FR)

Meta-scheduler COBalD/TARDIS used for years for efficient use of distributed compute resources (at KIT, BN, GÖ, FR, .... for integration of BAF, CLAIX, Emmy, HoreKa, Nemo, ...)



## Extension of COBalD/TARDIS and its interfaces

to provide resources depending on the forecasted availability of RE (from energy grid or local photovoltaic as prototype) → next slide

## Development and Implementation of checkpoint-restore for compute jobs

need to stop, transfer and restore jobs from one site to another (e.g. explore usage of CRIU with container technologies)

## Implementation of dynamic resource limit in COBalD/TARDIS

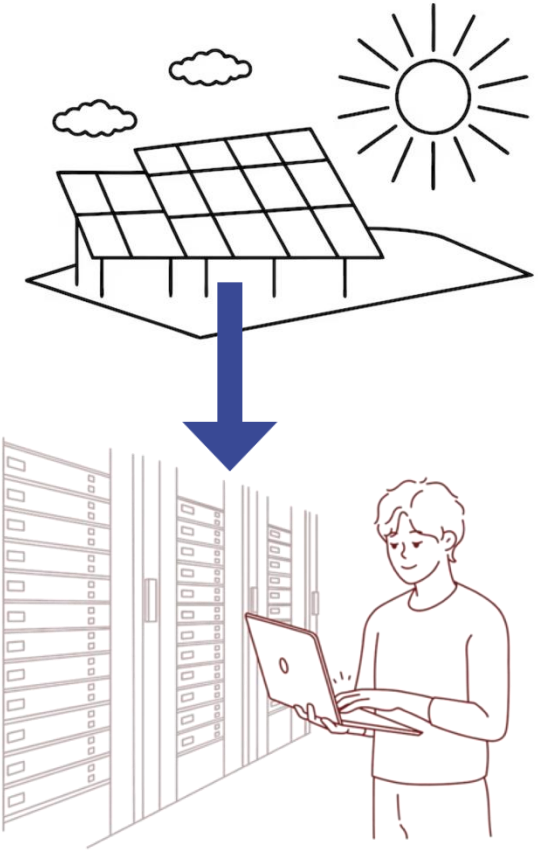
to optimize booking of resources vs. RE availability / compute request, ...

## Optimization of power efficiency upon tuning clock frequencies

- perform measurement of energy consumption and HS23 performance on clock frequency for various architectures at different sites
- development of strategy and system daemon for how to optimally adjust clock frequency to RE availability
- extend COBalD to provide dynamical clock frequency to AUDITOR







Provide opportunistically resources depending on the forecasted availability of RE from photovoltaic at the sites itself (or via an exceeding RE from the electricity provider).

In the future: balancing aspects of the power grid by turning on and off huge power consumers on demand will gain more importance → additional use case of BCC

## Steps:

- Extend COBalD/TARDIS to use external input from “Forecasting and Optimization” to dynamically scale compute resources depending on the green energy forecast.
- Define dedicated interface between „Forecast“ and COBalD balancing daemon for resource scheduling and its implementation into the COBalD balancing
- Identify interfaces for the resource life cycle management of bare metal machines and develop corresponding python interfaces (e.g. Redfish (Redfish Scalable Platforms Management API), RedHat Satellite System Management Platform
- Extend TARDIS to effectuate the scheduling decision from COBalD based upon “Forecast” service the by booting or draining/shutting down bare metal servers

## Perform tests

- to determine the potential impact of BCC on strategy for the hardware lifetime,
- to determine the upper bounds of floating servers
- to optimize turn-around times to allow smooth operation

500 kW peak @ KIT SCC  
15+44 kW peak @ FR Physics  
xyz? kW peak @ GÖ  
xyz ?kW peak @ DESY

# Accounting (lead and coordinated by Freiburg, M. Böhler; partners KIT, Öko-Institut)

Flexible accounting ecosystem AUDITOR in use at CERN, DESY, KIT, FR, WU, ... and dissemination to all WLCG sites in progress  
Extension of AUDITOR in various ways foreseen  
with final goal to deliver a full accounting of the CO<sub>2</sub> footprint.



New AUDITOR plugin is to be developed and implemented  
to determine energy consumption and CO<sub>2</sub> footprint for compute jobs from the runtimes  
and used local energy mix (from interface to „Forecasting“)

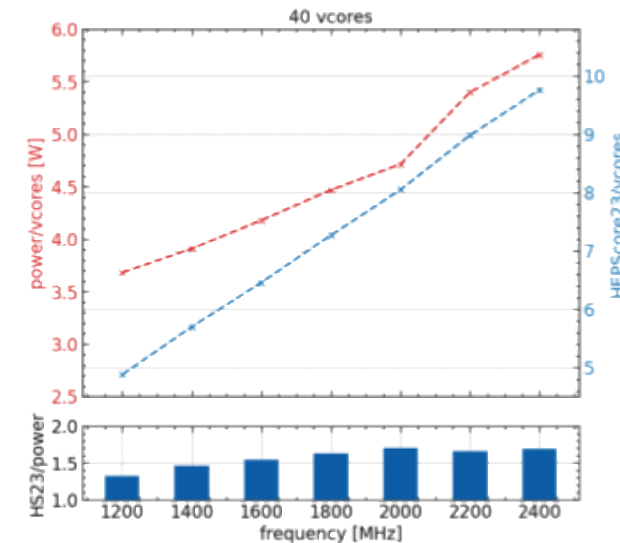
Evaluation. adaption and extension of set of key performance indicators (KPI)

- developed in previous project by Öko-Institut on green computing
- newly defined for the specific processes relevant in data handling, job distribution and data analysis in the ErUM community

Extension of AUDITOR to collect data for

- data concerning water usage and abiotic resources depletion related to specific hardware components
- energy consumption and CO<sub>2</sub> equivalent due to data transfer and network
- embedded emissions in production and disposal

Development of optimization strategy and implementation of feedback loop  
into „Forecasting“, „Orchestration“ and „Digital twin“

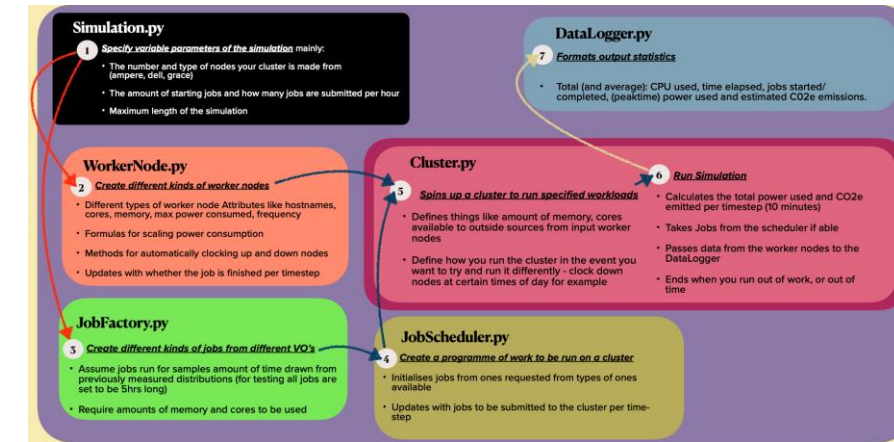


Extension for GPU accounting  
Extension for time dependent clock rate  
(Extension for analysis facilities)

# Digital Twin (lead and coordinated by DESY, D. Spiteri; partners BN)

## Simulation and optimization framework prototype developed at DESY for single site

using as input information: site inventory (CPU type, nr. of cores, memory, ...), machine-dependent power specifications (idle, full load, freq. dep) and carbon intensity of the grid, job mix, ....  
delivering an estimate of the total power used and its CO<sub>2</sub> emissions for different ways of how to perform a specified workload



Goal: Simulation of geographical federated IT infrastructure, which commits to pledges and help reducing energy impact, primarily by having the functionality to transfer jobs to different sites.

### Steps:

- **Partner data-centre integration:** collect information about site inventory, metrics (PUE, HS23-per-core as function of clock frequency) of sites, local grid intensity at sites in common data base (in cooperation with data curation in „Forecasting“)
- **Improved estimate of CO<sub>2</sub> footprint:** include embedded CO<sub>2</sub>, storage, network, ... by adapting to databases/ accounting models developed in work packages „Forecasting“ and „accounting“
- **Deployment of full simulation infrastructure** for various sites including realistic job orchestration a la COBald/TARDIS including job transfers from one site to another when running
- **Development and deployment of feedback-loops from/ to other work packages**
- **Validation and optimization:** compare simulation to measured data and optimization of simulation hyperparameters

# Education & dissemination, role of associated partners, .... (all)

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Thorough documentation, development of tutorials and conduction of educational workshops in order to foster new use cases and to disseminate the developed concepts and ecosystems to a wider audience  
Workshops shall be advertised and organized in cooperation with the ErUM-Data Hub.

Feedback by and roll out to WLCG via S. Campana (WLCG project leader)

Connection link, alpha-users and multipliers in respective community:

KAT community via K. Valerius (KIT) and M. Schumann (Freiburg)

KFS community via C. Gutt (Siegen) and KFB community via E. Bründermann (KIT)

Heads of the HPC centres at Freiburg (D. von Suchodoletz) and at the SCC at KIT (A. Streit)  
provide feedback from a computer science and resource provider point of view

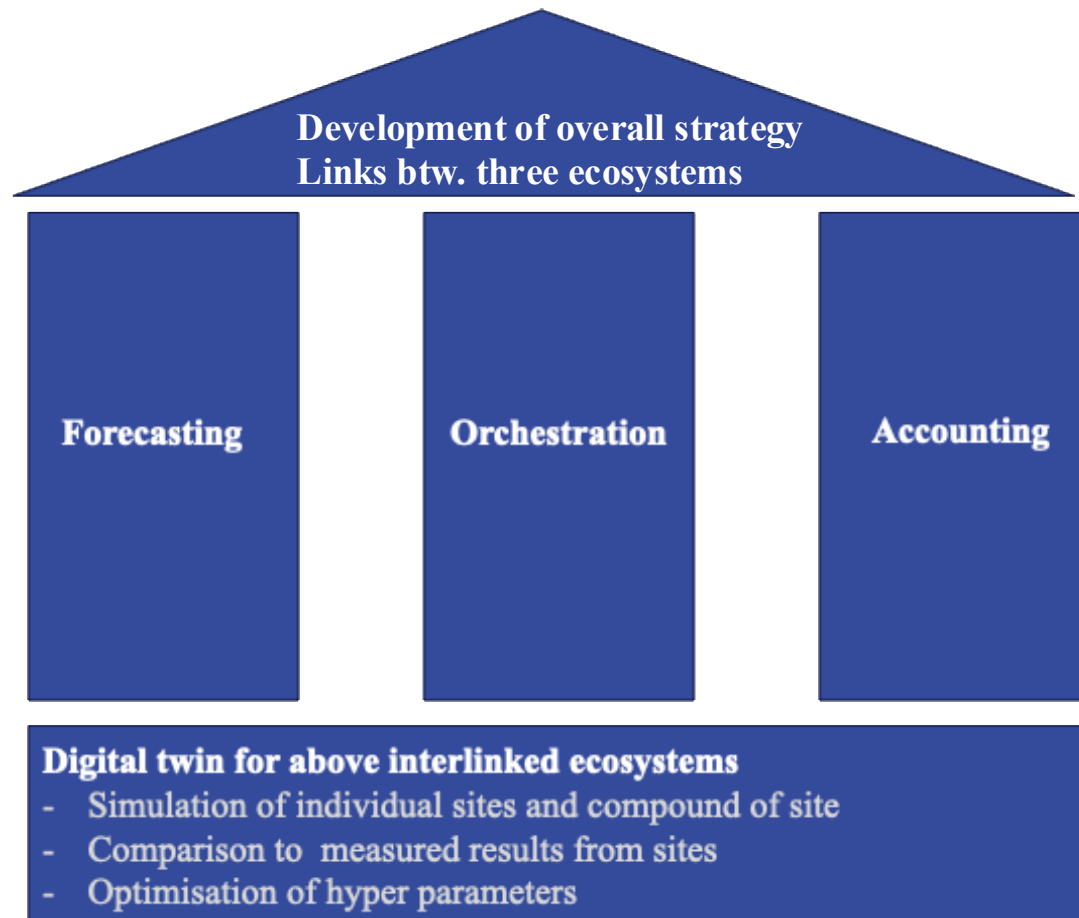
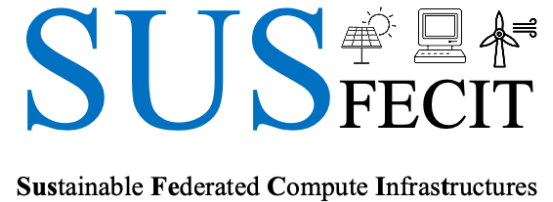
Links to other BMFTR-funded research networks such as “Federated storage FUSE”, to PUNCH4NFDI, EOSC ...  
via individuals from (associated) partner institutes, who are active members (of boards ) in this initiatives

The ErUM-Data Hub kindly agreed that it will provide support for dissemination of developed concepts and technologies and for conducting workshops and tutorials to train scientists in all ErUM communities.

# Conclusions

- 2024: electricity consumption of compute centres in D 20 billion kWh in 2024 (4% of total), 7.3 t CO<sub>2</sub> footprint
- Next 5 years: energy consumption expected to double  $\leftrightarrow$  goal of CO<sub>2</sub> neutrality in D in 2045

➔ Advance environmental sustainability of scientific computing in SUFECIT project



## Goals:

- increase the environmentally sustainable use and operation of federated compute infrastructures
- raise awareness of the impact of scientific computing on CO<sub>2</sub> footprint from ErUM communities
- train talented early career scientists in cutting-edge technologies

## Hope:

- SUSFECIT will provide tools to help reach this goal and dissemination to ErUM communities and beyond will be successful