

And interdisciplinary Digital Twin for Particle Physics



Dr. Isabel Campos Plasencia $i \in S \subseteq S \subseteq C$ $i \in G \in S \subseteq C$

L International Meeting on Fundamental Physics & XV CPAN days

Santander, October 2023



IFCA Computing





Ongoing and recent Projects and initiatives Participation in a wide range of projects and initiatives in areas such as:

- Quality assurance
- Software management
- Linux containers
- Data repositories
- Federated/distributed computing
- High Throughput (Grid) Computing
- Cloud Computing
- High Performance Computing
- <u>Digital Twins</u>



Digital Twin

A <u>virtual replica designed to accurately reflect</u> <u>real world</u> objects, systems or processes.

• a high-fidelity model of a system which can be used to emulate the actual real system

A <u>digital twin goes beyond mere simulation</u>:

- is much a richer virtual environment that mimics the physical one
- enables study and prognosis of multiple processes
- can be feed with real data

First Digital Twin: born at NASA

iolio Simulators installed at NASA - Front-Lunar Module Simulator (green) Mild-Mission Effects Projector-Lunar surface (gree Back - Command Module Simulator (tan)





"Keep 'em Running," screamed Astronaut Eugene A. Cernan as he strode into the simulator room late on that fateful Monday night." (Connecting Link magazine, Summer 1970 issue)

1960s as a "living model" of the Apollo mission. In response to Apollo 13's oxygen tank explosion

• NASA employed simulators to evaluate the failure and extended a physical model of the vehicle including digital components.

The "digital twin" was able to rescue the mission by simulating

Destination Earth



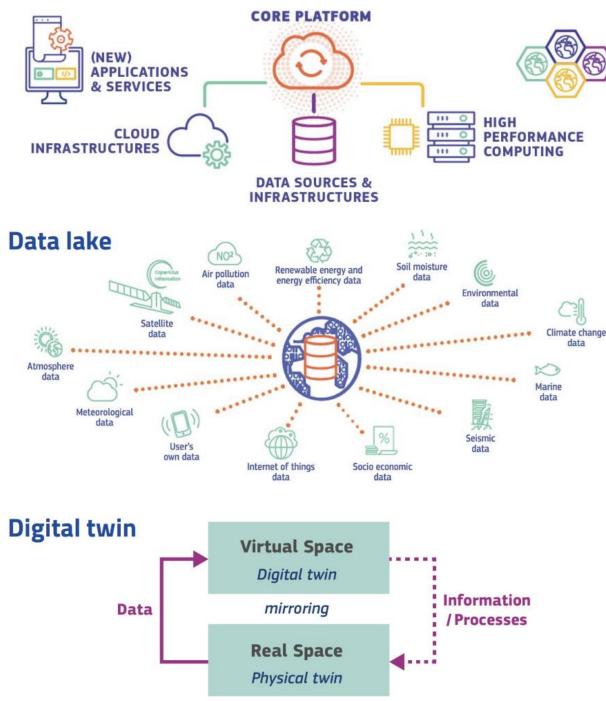
Is a flagship initiative of the European Commission to develop a highly-accurate digital model of the Earth: **a digital twin of the Earth**

Understand and simulate the evolution and behavior of the Earth system components.

Digital modelling of the Earth system

Provide evidence-based decision-making tools.

Based on an open, flexible, and secure cloudbased computing infrastructure with access to data and HPC.



www.intertwin.eu

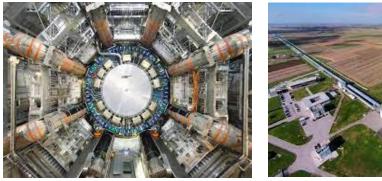








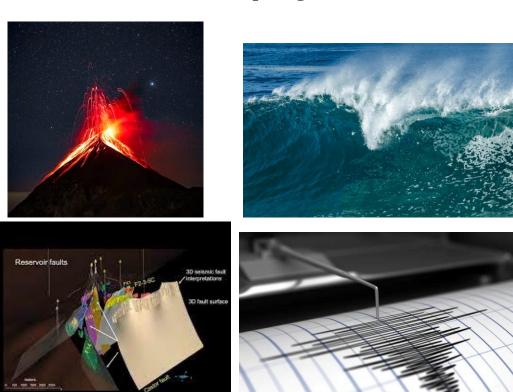
InterTwin → Interdisciplinary



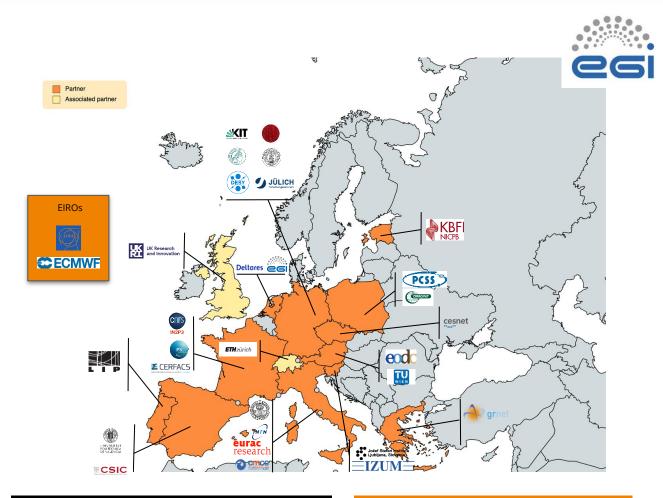




$DT-GEO \rightarrow Geophysical extremes$



Consortium



Budget 11,7 M euro

1.09.22 - 31.08.25

EGI Foundation as coordinator



Participants, including 1 affiliated entity and 2 associated partners

Consortium at a glance

10 Providers cloud, HTC , HPC resources and access to Quantum systems 11 Technology providers delivering the DTE infrastructure and horizontal capabilities

14 Community representants

from 5 scientific areas; requirements and developing DT applications and thematic modules

Interdisciplinary Digital Twins



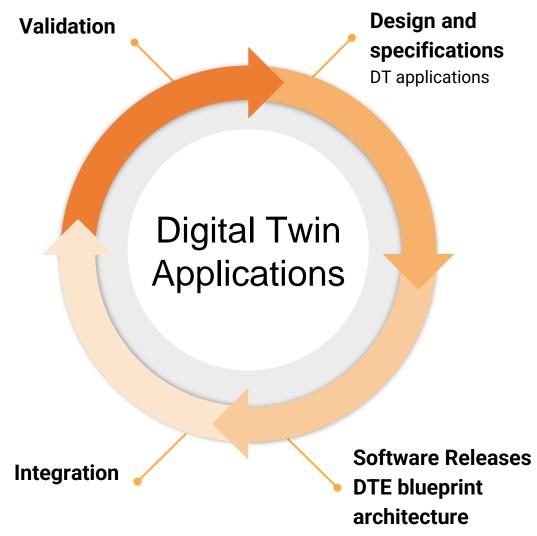
InterTwin (Sept. 2022 - Sept. 2025)

- Develop a common approach to the implementation of Digital Twins (digital twin engine - DTE)
- Applicable across the whole spectrum of scientific disciplines
- Open-source and interoperable platform
- Software components for modelling and simulation to integrate application-specific DTs
- **Blueprint architecture for DTs**
- Liaison with Destination Earth

Contribution from IFCA - CSIC **SIC**



- Software release and management
- Quality and validation for applications, models and services
- Lattice QCD





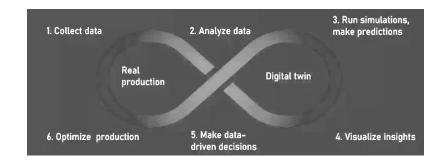
Elements of a Digital Twin

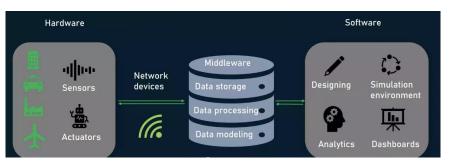
Hardware components. Measuring devices, sensors, etc... that initiate the exchange of information between reality and their software representation.

Data management middleware. A repository to accumulate data from different sources. Ideally, also takes care of data integration, processing, data quality control, etc... by interacting with software components

Software components.

- The analytics engine that turns raw observations into predictions by the simulation software
- In many cases, powered by machine learning models.
- Other: dashboards for real-time monitoring, design tools for modeling etc...







Digital Twins versus Simulations

How does one formulate a new Physics law?

- 1. First, we guess it
- 2. <u>Second</u>, we compute the consequences of that guess in measurable terms
- 3. <u>Third</u>, we compare with nature: i.e. compare with experimental observations
- Our "core business" is advancing computing technologies to support scientific challenges.
- Developing solutions for specific Scientific & Technological challenges notably for steps (2) and (3)
- Some are even trying to apply Artificial Intelligence to (1). The value of knowledge without understanding is however very limited.

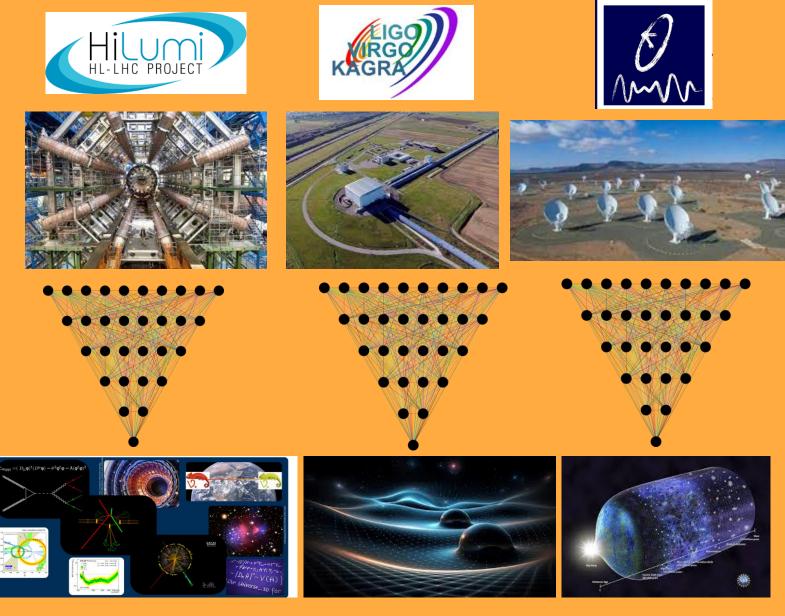
We are trying to exploit the technologies associated with Digital Twins (an industrial concept born in aeronautics) to improve research capabilities in HEP, Observational Astrophysics, Extreme phenomena, Geophysics, Climate predictions, etc...

How are "our simulations" related to the concept of Digital Twins



Digital Twins in HEP and Astro

- Fast Algorithms for Detector Design based on GANs
- Theoretical Computations and Simulations Simulations CSIC
- Machine Learning tools to accelerate the simulation with respect to conventional Monte Carlo
- Machine learning to help detecting noise in signals



Elementary Particles

Gravitational Waves

Dark Matter

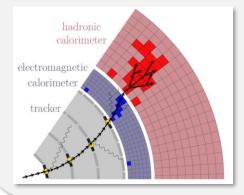


Digital Twin of a LHC detector



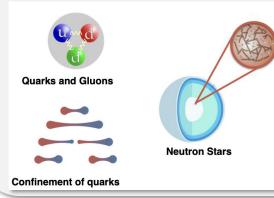
DT in High Energy Physics

DT of Large Hadron Collider (LHC) detector components



Seeking for strategies to face the increase in the need for simulated data expected during the future High Luminosity LHC runs. The primary goal is to provide a fast simulation solution to complement the Monte Carlo approach. *Faster and deeper cycles of optimisation of the experiment parameters* in turn will enable breakthroughs in experimental design.

DT of the Standard Model in particle physics



Competitive results in Lattice QCD require the *efficient handling of Petabytes of data*, therefore the implementation of advanced data management tools is mandatory. On the side of algorithmic advancement, ML algorithms have recently started to be applied in Lattice QCD. The goal is to *systematize the inclusion of ML for large scale parallel simulations*.



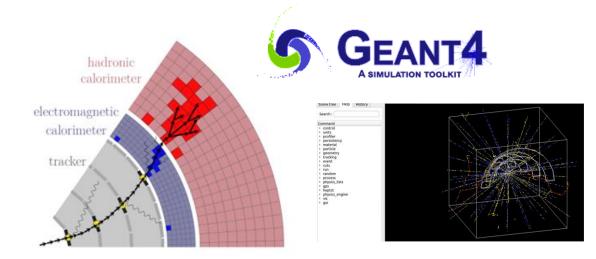
High Energy Physics: DT of a HEP detector

Detector Simulation Software = Software that simulates the physics processes happening at the detector level **GEANT4 is the golden standard software for detector simulations**:

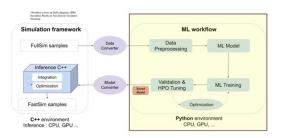
 \rightarrow Passage of particles through matter, in particular through the materials a particle detector is made of. Expensive to run (40% of the time spent in all the MC simulations needed)

 \rightarrow Machine learning (ML) provides a complementary approach: by learning a map between incident particles and detector response using GEANT4 as reference result.

• Using ML to accelerate detector simulation is a popular option currently under investigation







DT Particle Detector application - Scope

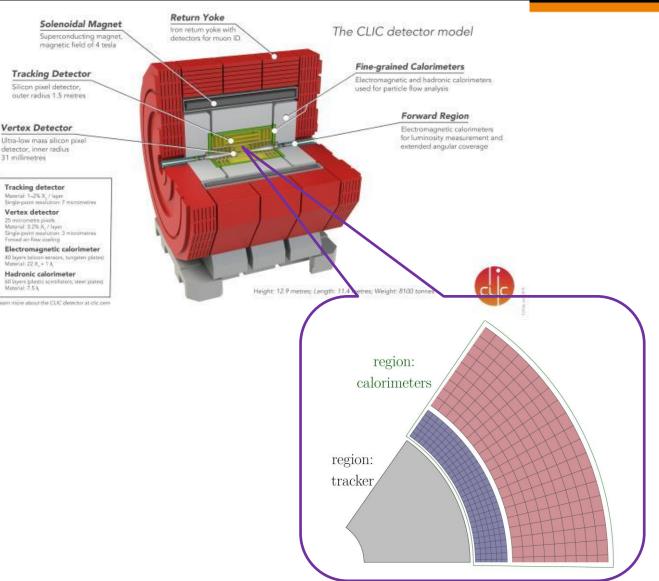
31 millimetres

60 layers (plastic sz Matorial 7.53

- **Detector Prototyping &** Optimization
 - Build data-driven tool that ٠ simulates detector response and integrates operation conditions from experimental setups (test-beams)

Online ML for Detectors

- adapt real-time detector and/or data ٠ acquisition configuration with respect to run conditions
- **Quality verification & Validation** frameworks
 - model **convergence and accuracy** of the generated data should be monitored
 - development of sample-based ٠ validation framework in collaboration with HEP community



Technical requirements based on capabilities

Generate input data for training

Run Monte Carlo simulations locally using GEANT4 software Ø Output: ROOT files (<u>https://root.cern.ch/</u>)

Pre-process ROOT files before feeding the data into the ML model

Input: ROOT files Ø Output: HDF5 files (decreased volume)

Store input and output data

Object or local storage

Distributed training with multiple GPUs

GANs, to be tested: Transformer-based models

Model inference

Validation/Quality Check

- Comparing generated data with Monte Carlo data
- Sample-based metrics

Continuous re-training

- Current state of use case (as described in proposal) is a static synthetic model of a detector.
- Exploring of extending to an application capable of modelling in real time the detector's output in different operation conditions (beams and accelerator configurations)
 Continuous retraining on real data

Theoretical Simulations: Lattice QCD





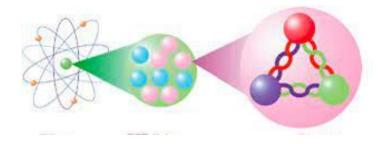
High Energy Physics: the quest for reality

Standard Model three generations of matter interactions / force carriers (fermions) (bosons) Ш ≃1.28 GeV/c² ≃173.1 GeV/c² mass ≃2.2 MeV/c² ≃124.97 GeV/c² charge 2/2 ⅔ ⅔ 0 С g н τ u 1/2 1/2 1/2 spin up charm top gluon higgs S ≃4.7 MeV/c² ≃96 MeV/c² ≃4.18 GeV/c² 0 **DUARK** BOSON -1/3 -1/3 -1/3 0 b d S γ 1/2 1/2 1/2 strange bottom down photon SCALAR ≃0.511 MeV/c² ≃105.66 MeV/c² ≃1.7768 GeV/c² ~91.19 GeV/c² GAUGE BOSONS VECTOR BOSONS -1 -1 Ζ е u τ 1/2 1/2 1/2 electron Z boson muon tau EPTONS <1.0 eV/c² <0.17 MeV/c² <18.2 MeV/c² ≃80.39 GeV/c² 0 ±1 v_e v_{τ} v_{μ} 1/2 1/2 1/2 electron muon tau W boson neutrino neutrino neutrino

Quantum Chromo Dynamics part three generations of matter interactions / force carriers (fermions) (bosons) Ш mass ≃2.2 MeV/c² ≃1.28 GeV/c² ≃173.1 GeV/c² 0 0 charge 2/3 2/3 ⅔ g С t u 1/2 1/2 spin charm top gluon up ≃4.18 GeV/c² UARKS ≃4.7 MeV/c² ≃96 MeV/c² -1/3 -1/3 -1/3 C S b 1/2 1/2 1/2 strange bottom down 0 Strong force

High Energy Physics: Lattice QCD "First, we guess it"

"Reality of interest": Quantum Chromo Dynamics



QCD is believed to explain why quarks are confined inside hadrons

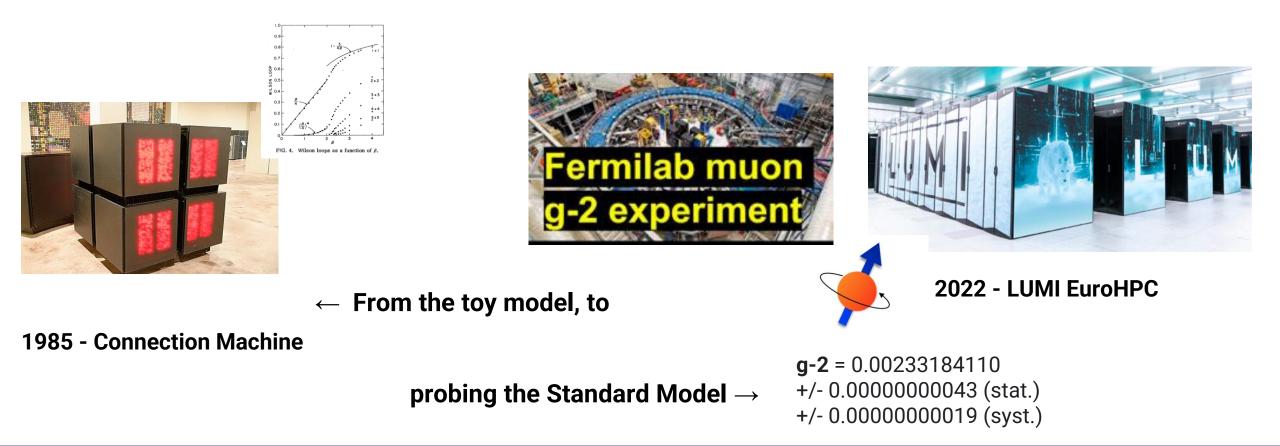
Real data: from particle accelerators experiments

Matching with simulations is the subject of an entire subarea of HEP : Phenomenology.

That's it

Is Lattice QCD actually a Digital Twin of the underlying particle physics real world ? The question is impossible,, because we do not really know how the real world looks like

High Energy Physics: LQCD > 30 years of development "Second, we compute the consequences of that guess"

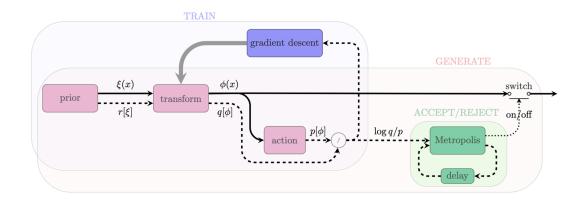


"Feynman had to write a computer program to test the machine. Since he only knew BASIC, invented a parallel version of BASIC, and programmed Lattice QCD. He was excited by the results. **"Hey Danny, you're not going to believe this, but that machine of yours can actually do something useful !** "(Daniel Hillis, in "Richard Feynman and the Connection Machine")



Machine Learning in Lattice QCD

- Speeding up the generation of QCD configurations in complex areas of the parameter space.
- The Machine Learning process learns on the results of the full Monte Carlo simulation, comparing the results of reference observables (eg. energy) with those obtained using reference codes (eg. OpenQCD).
- Designing better architectures for Machine Learning models so that the acceptance rates become reasonable (~50% or more) as the volume of the lattice increases.



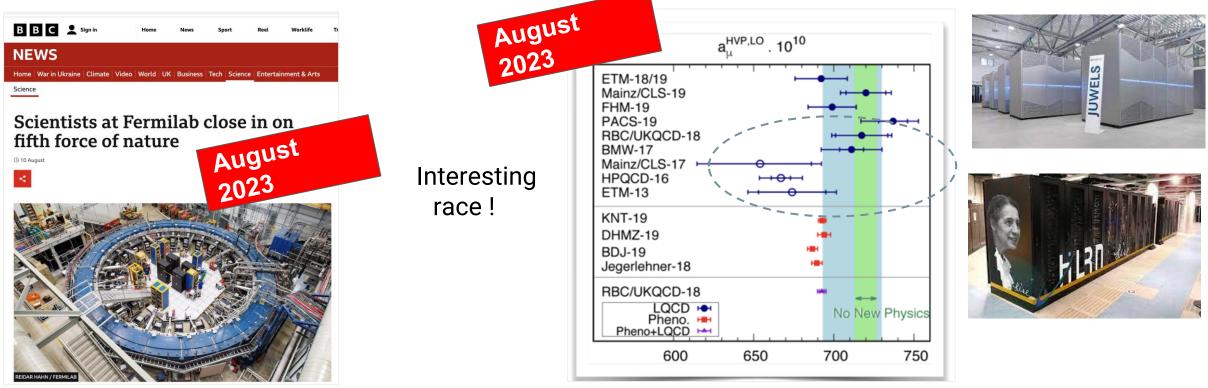


High Energy Physics: Lattice QCD - towards the Exascale Computing e

We gather data to measure (g-2):

- A. In experimental facilities: the answer of nature. Several experiments ongoing
- B. In the HPC systems by simulating the Standard Model (the QCD part)
 - if (A) is compatible with (B) the Standard Model stands correct



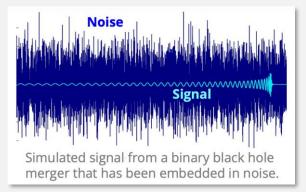


Digital Twin in Radioastronomy and Gravitational Wave detectors



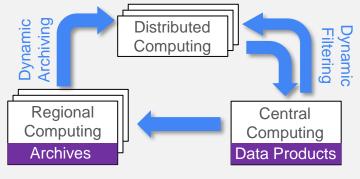
DTs of Radio astronomy and GW astrophysics

DT of the VIRGO Interferometer



It is meant to **realistically simulate** the noise in the detector, in order to study how it reacts to external disturbances and, in the perspective of the **Einstein Telescope**, to be able to detect noise "glitches" in **quasi-real time**, which is currently not possible. This will allow sending out **more reliable triggers** to observatories for multi-messenger astronomy.

DT for noise simulation of next-generation radio telescopes



Meant to provide DTs to simulate the noise background of radio telescopes (**MeerKat**) will support the identification of rare astrophysical signals in (near-)real time. The result will contribute to a realisation of "**dynamic filtering**" (i.e. steering the control system of telescopes in real-time).

VIRGO experiment

Measuring the disturbance of spacetime following a galactic "cataclysm" (eg. black holes colliding, neutron stars collisions, etc...)

Digital Twin of the Interferometer

 \rightarrow To realistically simulate the noise in the detector to study how it reacts to external disturbances

 \rightarrow To be able to detect noise in quasireal time to inform the online pipelines, which is currently not possible (--> to feed multimessenger astronomy)



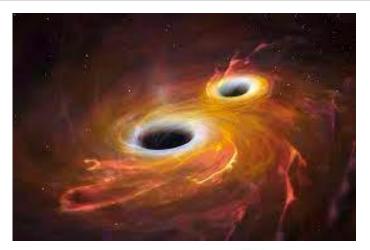
Following true cosmic cataclysm eg. collision of two black holes

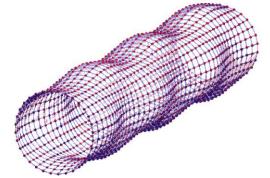
Gravitational Waves are generated: extremely non-intuitive but true \rightarrow

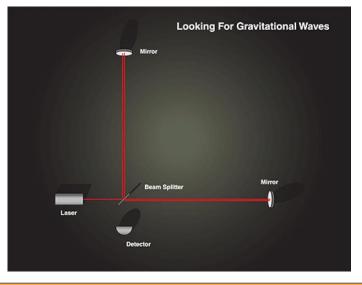
The detection of the distortion of space-time is a challenging experiment here on Earth



1907 Nobel Prize, Albert Michelson







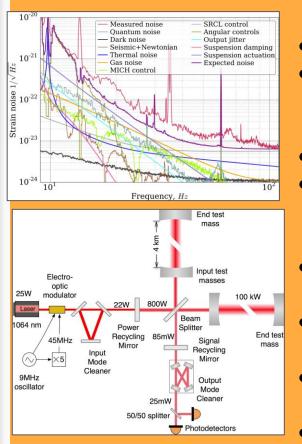
Digital Twin of a 3km long-arms Michelson interferometer

The experiment needs to measure a very faint signal

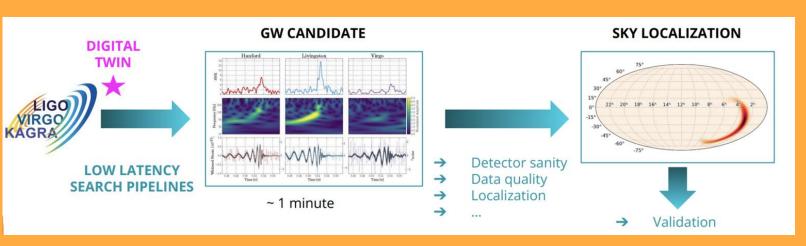
Removing the noise in the experiment is key:

A proper simulation of that noise is crucial to increase the sensitivity of the detectors



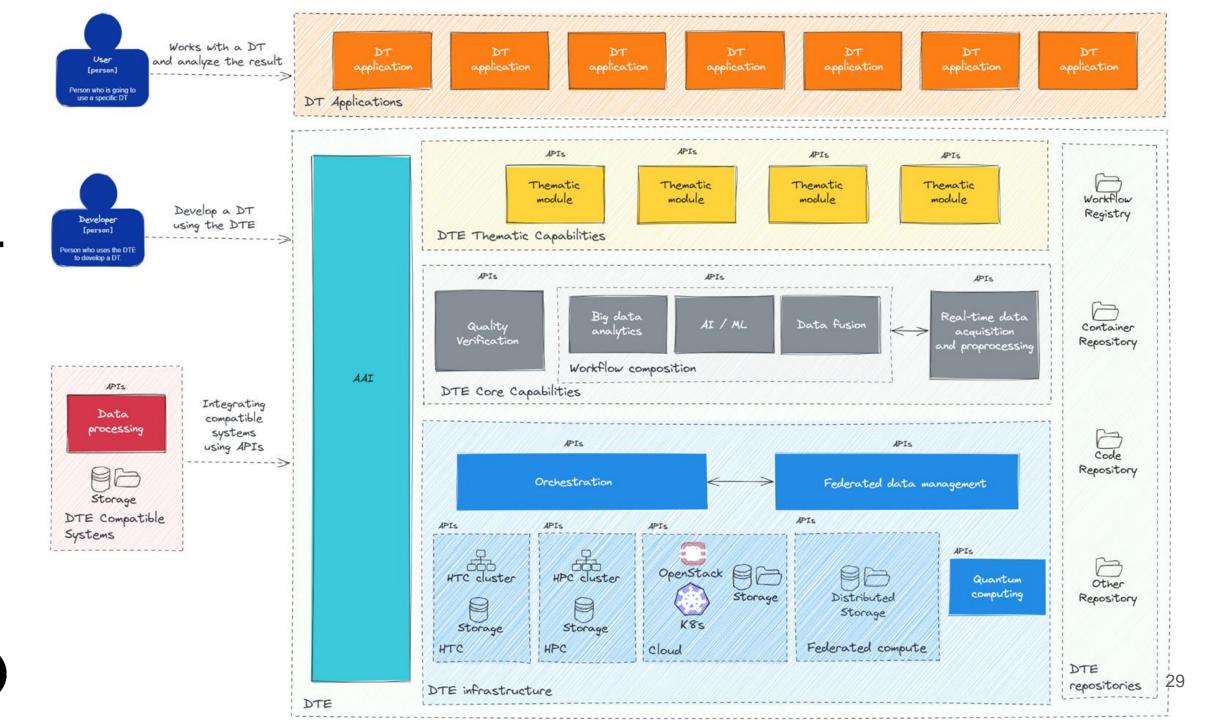


- Seismic noise, movements earth vibrations
- Thermal noise, from the microscopic fluctuationsof the individual atoms in the mirrors and theirsuspensions.
- **Quantum noise**, due to the discrete nature of light
- **Gas noise**, from the interactions of the residual gas particles in the vacuum enclosure with the mirrors and the laser light.
- **Laser noises**, small variations in the laser intensity and frequency.
- **Beam jitter**, or slight variations in the position and angle of the laser beam in the detector,
- Scattered light, generated by tiny imperfections in the mirrors of the interferometers
- And finally, electronics noise



The elements of the Digital Twin

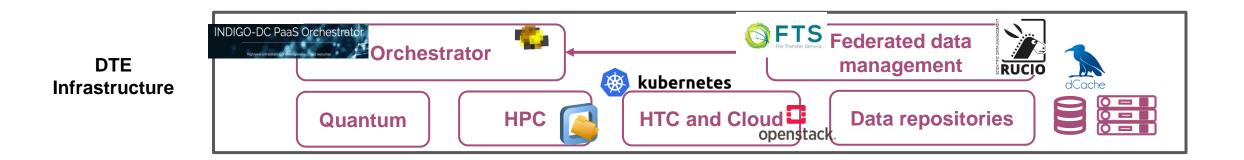




components interTwin



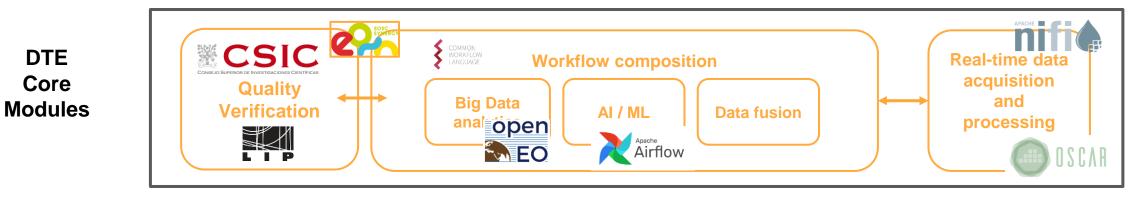
	Orchestrator	PaaS Orchestrator + Infrastructure Manager elaborating deployment requested expressed in TOSCA to be extended to deal with HPC and AI based orchestration	
-	Federated data management	Based on ESCAPE Data Lake architecture and services, Rucio , FTS and HTTP access caches/storages. Data lake concept extended to HPC facilities	
-	Federated Compute	Use of single-sign-on in complex simulation and modelling tasks to access data and different compute facilities, including offloading to HPC. Automated modelling and simulation fused with data repositories and computation with containers on HTC, Cloud and HPC	





DTE components - Core

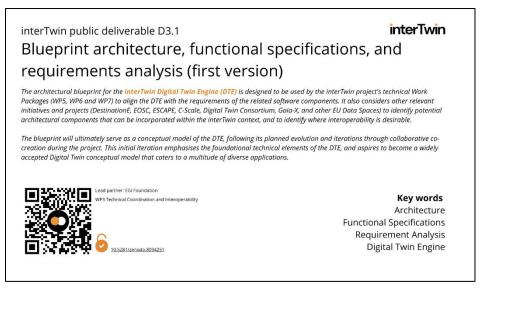
Workflow composition	Workflow definitions based on CWL , run on a workflow execution system (e.g. StreamFlow , AirFlow) and able to combine self-contained execution steps from other workflow engines (e.g. ecFlow , Ophidia , Delft-FEWS), different back-ends, distributed big data analysis tools (e.g. openEO, Dask , Spark) and ML/DL training platforms (e.g., Horovod , HeAT , PyTorch DDP). Data Fusion as one of the workflow steps to merge observational and modeled data and different data sources.
Real-time data acquisition and processing	Generic framework for real time acquisition and processing that builds on event-triggered execution of workflow engines and exploit serverless computing. Based on Apache NIFI and OSCAR Framework
Quality Verification	Specific module for quality assurance (QA) that aims at tackling the early validation of the DTs, before being deployed as a "living DT". Based on the SQaaS developed in EOSC Synergy project

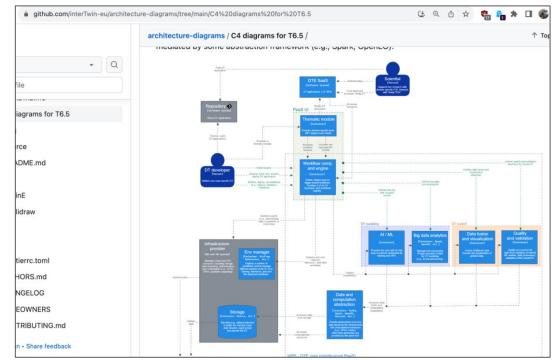




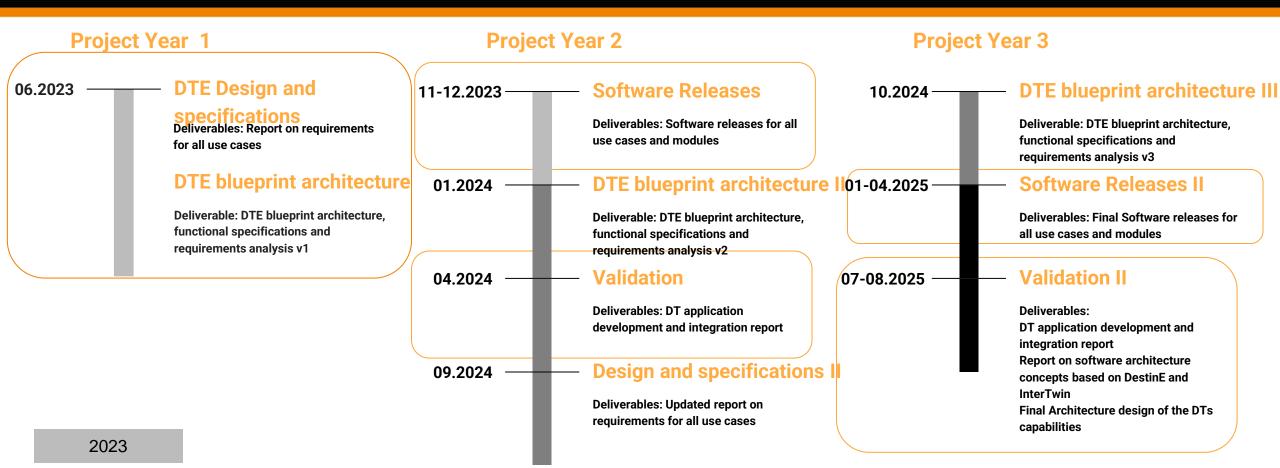
First version of the Blueprint architecture and design specifications are available in Github and Zenodo. Second and Third versions are planned in 2024

- <u>https://github.com/interTwin-eu/architecture-</u> diagrams/tree/main/Blueprint%20architecture
- https://zenodo.org/communities/intertwin/





Timeline





ZECCOCO Search Q Upload Communities	Log in	O Home Results	Co-designing and prototyping an interdisciplinary Digital Twin Engine. A:20 followers
UPDATE: Zenodo migration postponed to Oct 13 from 06:00-08:00 UTC. Read the announcement.			
interTwin project		Outputs On this page, we collect all project related	Overview Repositories 6 O Discussions Projects Packages A People
Recent uploads Search inter'Twin project	2 New upload	publications, public events, audivisual materials, reports, and deliverables	interTwin is an EU-funded project with the goal to co-design and implement the prototype of an interdisciplinary Digital Twin Engine - an open source platform based on open standards that offers the capability to integrate with application-specific Digital
Reparator 21,222 (11) Finantiation Oper Access InterTwin Digital Twin FloodAdapt	interTwin project		Twins.
Roscoe, Kathryn, et al.;	Curated by: EGIPMO	Presentations and Events Audiovisual Other Publications <u>Deliverables</u>	Pinned
Digital Twins can help mitigate flood risk, but are hard to deploy in all geographical circumstances Hundreds of millions of people around the world are at risk of flooding from the sea, from rivers or as a result of extreme rainfall. Every year, there are thousands of casualities and extensive dama	Curation policy: Not specified Created: June 7, 2022		G repository-template (Public template) ☆ 2
Uploaded on Signember 21, 3023	Harvesting API: OALPXH Interface	Presentations and Events	G Repositories
From Monitoring to Understanding: Towards a Digital Twin for Hydrological Drought Prediction		Presentation	Q. Find a repository Type • Language • Sort •
💿 Castelli, Mariapina; 😳 Claus, Michele; 💿 Crespi, Alice; 🕲 Bartkowiak, Paulina; 💿 Jacob, Alexander;	Want your upload to appear in this community?	Advanced 13/10/2022	interLink (Public)
Gives an introduction on how to go from monitoring to understanding in the context of drought events in alpine environments. If further shows how such a system can be built integrating machine learning models with physical based	Click the button above to upload a record directly to this community.	Advanced Computing Gordenian for Research I3/10/2022 interTwin: An interdisciplinary Digital Twin Engine for science- Ibergrid 2022	●Go ☆ 4 ⊕ MIT ♀ 4 ⊙ 15 № 0 Updated 5 days ago
enodo Community		Ninw View	T6.5-Al-and-ML Public

Zenodo Community https://zenodo.org/communities/intertwin/

https://www.intertwin.eu/outputs/

https://github.com/interTwin-eu

First Set of Technical Documents

- interTwin D3.1 DTE blueprint architecture, functional specifications and requirements analysis first version
- interTwin D4.1 First Architecture design of the DTs capabilities for climate change and impact decision support tools
- <u>interTwin D4.2 First Architecture design of the DTs capabilities for High Energy Physics, Radio astronomy and Gravitational-wave</u> <u>Astrophysics</u>
- interTwin D5.1 First Architecture design and Implementation Plan
- interTwin D6.1 Report on requirements and core modules definition
- interTwin D7.1 Report on requirements and thematic modules definition for the environment domain
- interTwin D7.2 Report on requirements and thematic modules definition for the physics domain first version

Thank you!

