DESTINATION EARTH

DIGITAL TWINS OF THE EARTH SYSTEM

Irina Sandu



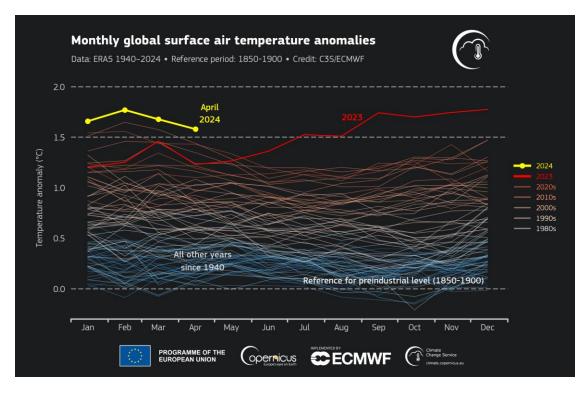






Funded by the European Union

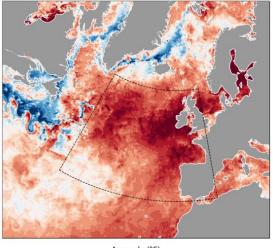
CLIMATE CHANGE AND INCREASE OF EXTREME EVENTS





Flash floods in Slovenia, August 2023

Anomaly in SST on 21 June 2023



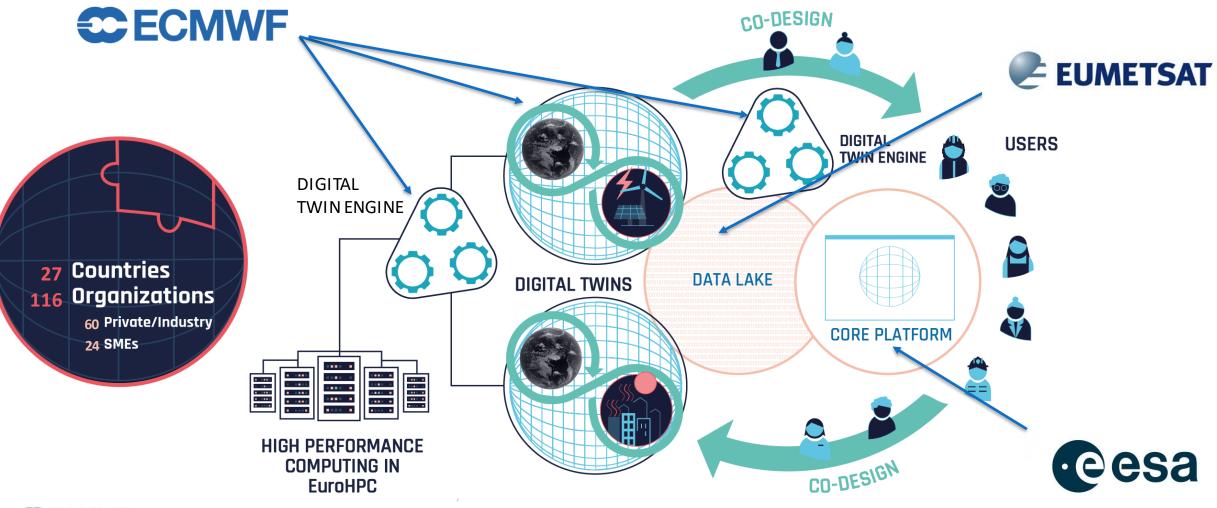
Anomaly (°C) -4 -3 -2 -1 -0.5 0 0.5 1 2 3 4

Marine heatwave in the Atlantic, Summer 2023

Funded by the European Union

implemented by 😂 ECMWF 📀 esa 🜽 EUMETSAT

DESTINE: A NOVEL INFORMATION SYSTEM



Funded by the European Union

DESTINE: A PILLAR OF THE GREEN AND DIGITAL TRANSITION

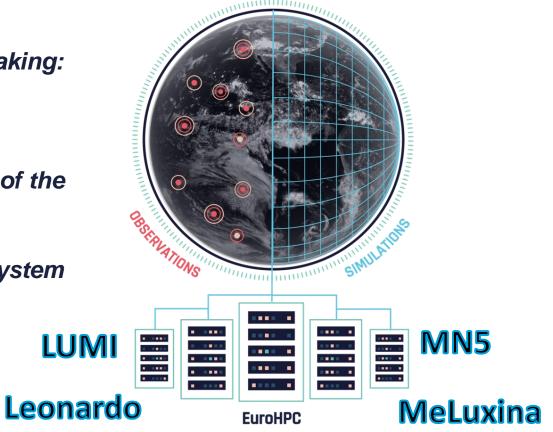
2022	20	June	2024	June 2	026 2030
Procuring and the key com and inter demonst at sca	ponents rfaces ration	System integration and testing with selected users	Opening to users the core service platform, the data lake, digital twin engine and digital twins	Evolutions and ramp- up operations, consolidation, maintenance and evolution of the DestinE system	Transition to long-term operations
	2023		10 th June 202	4	
EuroHP	PC access		DestinE Launch		

the European Union

DESTINE: DIGITAL REPLICAS OF OUR PLANET TO RESPOND AND ADAPT TO CLIMATE CHANGE AND EXTREME EVENTS

DestinE, in strategic partnership with EuroHPC Joint Undertaking:

- Establishes bespoke cutting-edge simulation capabilities ٠
- Provides Earth-system information at scales where many of the ٠ impacts of extreme events and climate change are felt
- Fosters an innovative and thriving Al-enabled digital ecosystem ٠





implemented by CECMWF CESA 🗲 EUMETSAT

DestinE builds on European investments in Earth-system modelling & observations, AI and **EuroHPC**

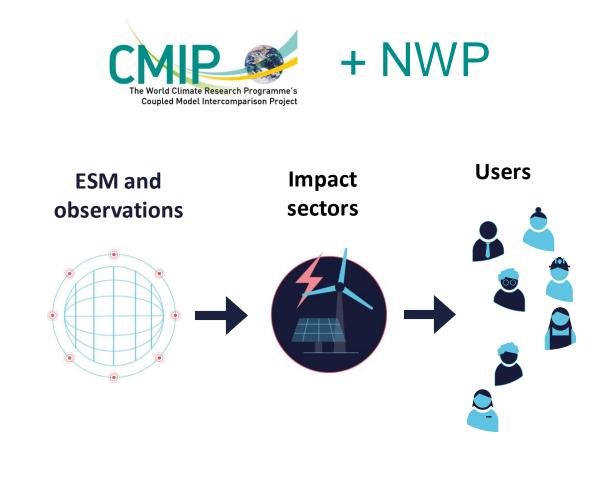
to take Europe's decision-making capabilities to the next level





implemented by CECMWF CESA CEUMETSAT

LIMITATIONS OF CURRENT SYSTEMS



Separation of ESM and sector models

Limited versatility to access and interact with data

Limited resolutions

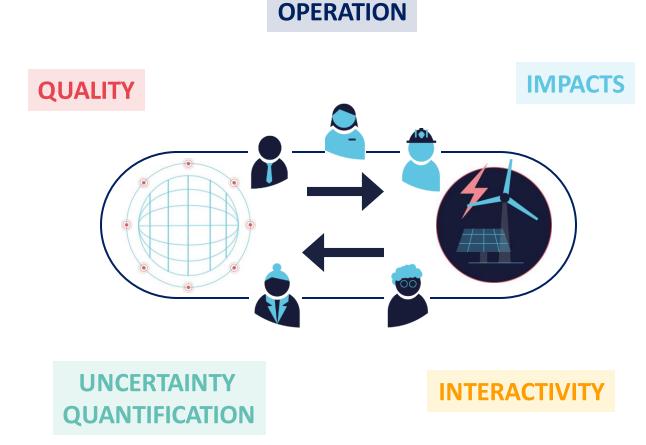
Small scales processes not represented

Experimental design and outputs not flexible

Update frequency doesn't meet user needs (CMIP every 7 years)



DESTINE'S DIGITAL TWINS OF THE EARTH







High-frequency data streaming
 Bespoke cutting-edge simulations



Increasing ESM resolution to km-scale
 Improving the physics of km-scale



Physics-driven ensemble, scenarios
 AI/ML ensemble



Weather-impact sector predictions
 Operational multi-decadal projections

DestinE's DTs: Weather-induced Extremes and Climate Change Adaptation

Establish bespoke cutting-edge simulation capabilities of the Earth system

Provide Earth-system information at scales where many of the impacts of extreme events and climate change are felt





TWO DIGITAL TWINS FOR WEATHER AND CLIMATE IMPACTS

WEATHER-INDUCED EXTREMES DIGITAL TWIN

A few days ahead



When will the wind farm shutdown and what will happen to energy production?

CLIMATE CHANGE ADAPTATION DIGITAL TWIN

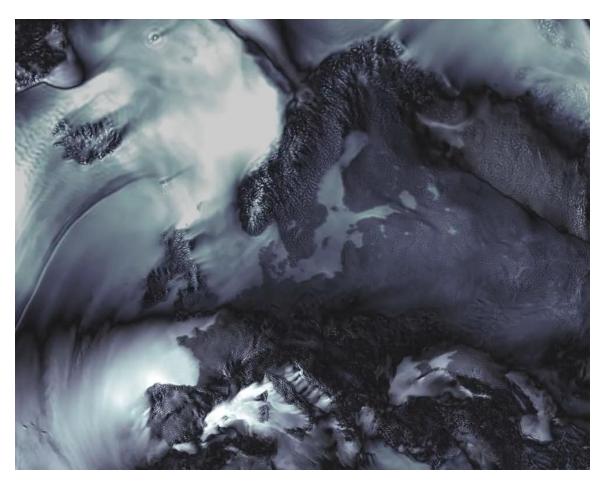
Multi-decadal timescales



Where should we build the next wind farms knowing storm occurrences could shift depending on different scenarios?

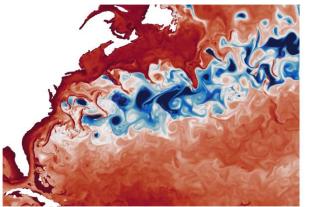


A HD+ VIEW OF THE EARTH SYSTEM FROM DAYS TO DECADES AHEAD









Buildingon







GLOBALLY CONSISTENT INFORMATION WITH LOCAL GRANULARITY



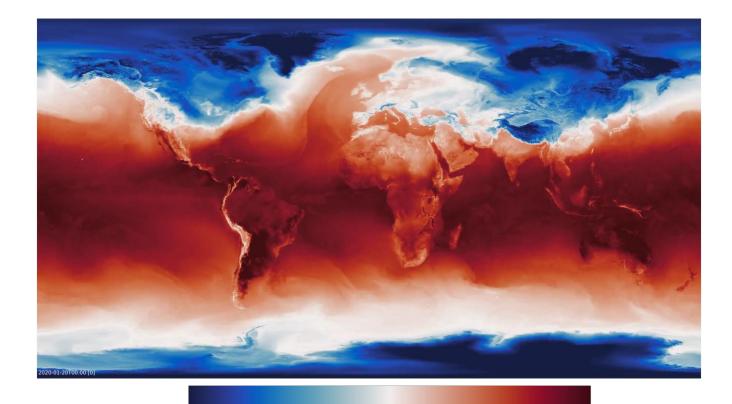


CLIMATE CHANGE ADAPTATION DIGITAL TWIN

CSC	CSC – IT Center for Science	FI	
BSC	Barcelona Supercomputing Center/Centro Nacional de Supercomputación	ES	
MPI - M	Max Planck Institute for Meteorology	DE	
UH	University of Helsinki	FI	
AWI	Alfred Wegener Institute, Helmholtz Centre for Polar and Marine Research	DE	
CNR-ISAC	Consiglio Nazionale delle Ricerche, Instituto di Scienze dell'Atmosfera e del		
	Clima		
POLITO	Politecnico di Torino	IT	
FMI	Finnish Meteorological Institute	FI	
DWD	National Meteorological Service of Germany	DE	
UFZ	Helmholtz Centre for Environmental Research	DE	
UCLouvain	Université catholique de Louvain	BE	
DKRZ	German Climate Computing Centre	DE	
HPE	Hewlett Packard Enterprise	FR	

CLIMATE DT: 1ST OPERATIONAL CAPABILITY FOR CLIMATE PROJECTIONS

To test the impact of certain events, scenarios or policy decisions on multi-decadal timescales



0 °C 10

20

-20

-10

-30

Regularly updated (yearly) and on-demand

1 x scenario 30 years == 1-1.5 Million GPU h or 34 Million CPU-core h

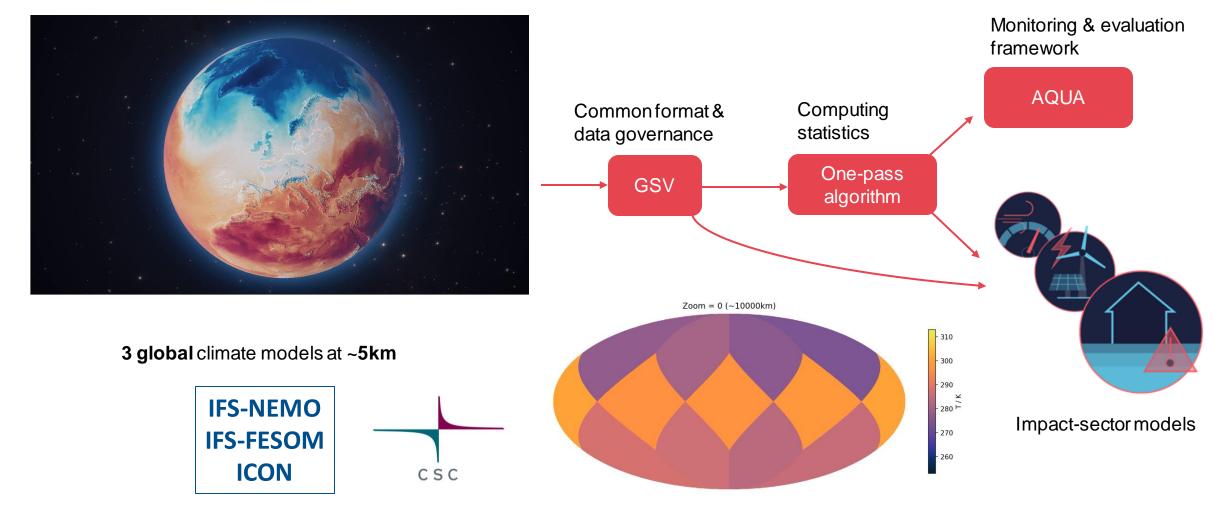
How will the climate evolve over the next decades following scenario A or B or if a particular event happens?





DESTINATION EARTH

CLIMATE DT: 1ST OPERATIONAL CAPABILITY FOR CLIMATE PROJECTIONS



Healpix a common grid for climate DT outputs



the European Union

implemented by CECMWF Cesa 🗲 EUMETSAT

CLIMATE DT: PRODUCTION OF GLOBALLY CONSISTENT CLIMATE **INFORMATION AT KM-SCALE, REGULARLY OR ON DEMAND**

-10

-15

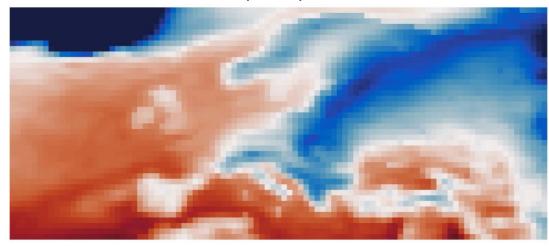
-20

-5

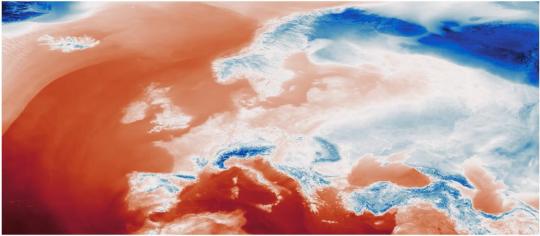
10

5

15



IPCC AR6 (2021), 100km



Digital Twin, 5km

Current climate projections:

run through research efforts, in 7 to 10 years cycles, 100km spatial resolution, 6 hourly temporal resolution

Climate DT

multi-decadal projections (yearly or on demand), higher temporal resolution (hourly),5 -10 km spatial resolution, flexible workflows that can be tailored to user requirements

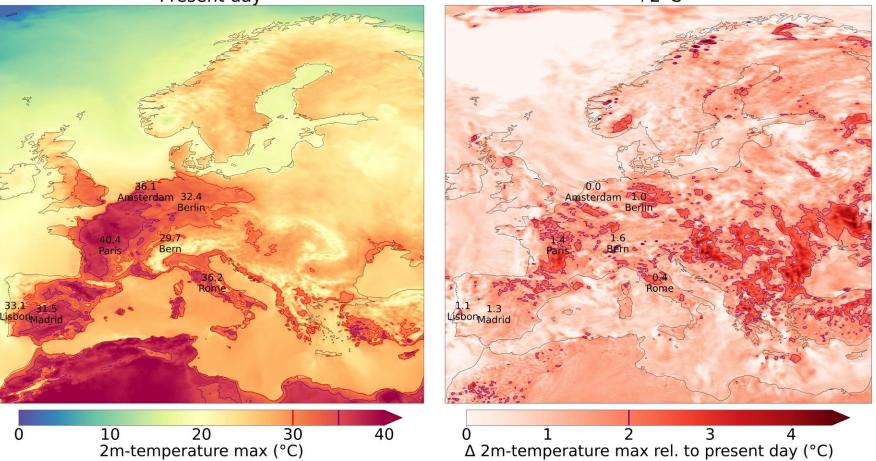


implemented by SECMWF COSA SECMETSAT

CLIMATE DT: STORYLINES OF EXTREME EVENTS

Present day

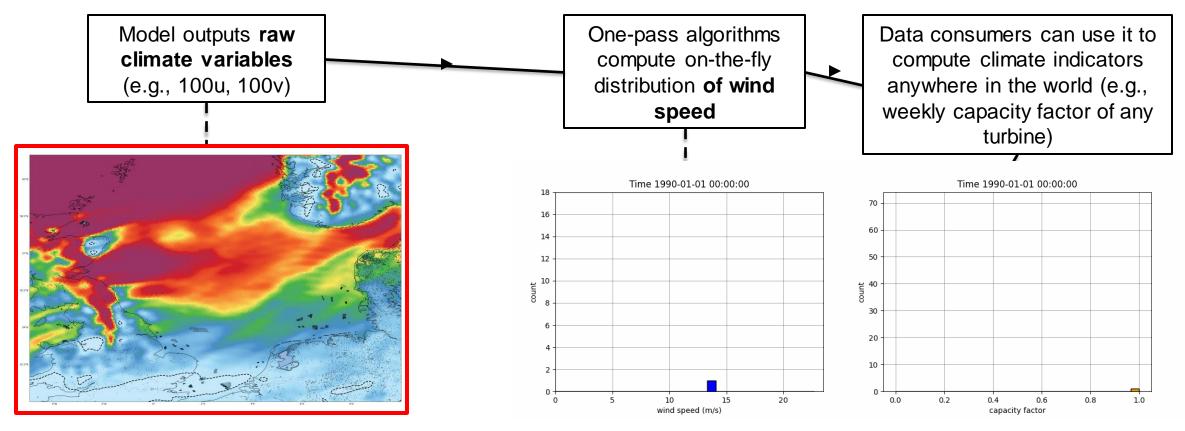
+2°C



IFS-FESOM with large-scale nudged towards ERA5 (2018-2023)

STREAMING DATA TO APPLICATIONS & TAILORING IT TO USERS NEEDS

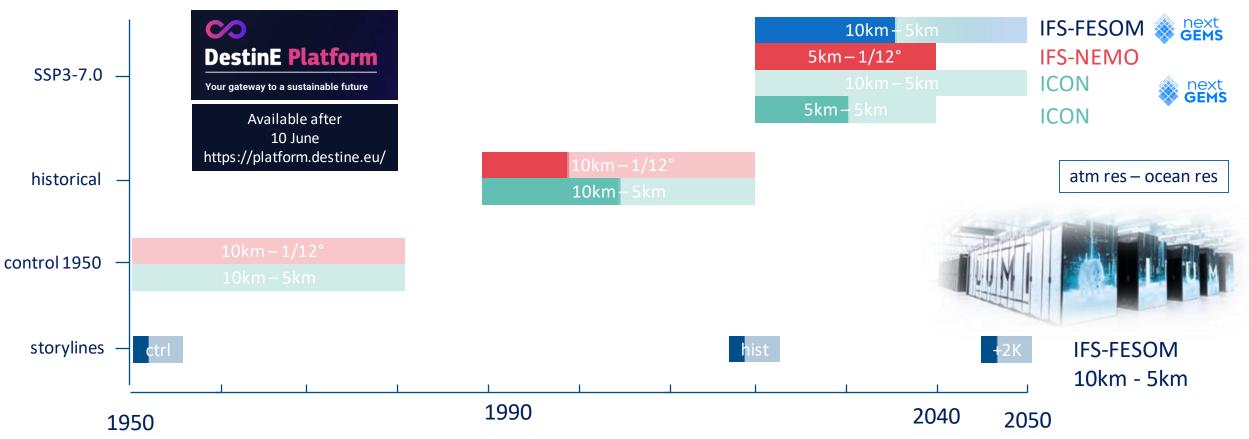
Streams raw climate variables through the one-pass layer (data-reduction tasks that compute indicators) to the data consumer computing user-relevant indicators on-the-fly.



CECMWF

North Sea - Moray East wind farm: 58°N, -2°E

CLIMATE DT : SIMULATIONS



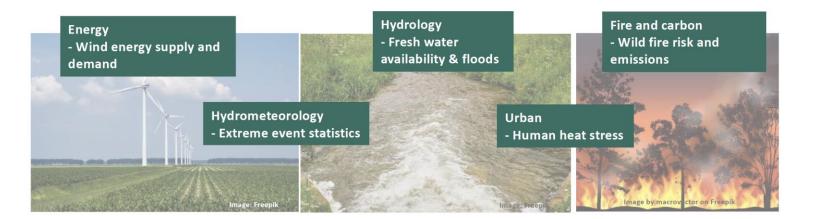
End-to-end climate DT workflow, including selected applications, deployed on LUMI, in less than one year!

First ever prototype projections at ~ 5km across earth-system components running now on LUMI with 2 models (IFS-NEMO, ICON), streaming information to selected applications ; and historical runs at 10km since 1990



CLIMATE DT: PHASE 1 DELIVERY

- Set-up end-to-end workflows on LUMI to operationalize multi-decadal projections using advanced high-resolution (5km and 10km) global Earth-system simulation and including selected applications
- First ever prototype projections (2020-2040) at ~ 5km across earth-system components running now on LUMI with 2 models (IFS-NEMO, ICON), streaming information to selected applications; historical runs from 1990 at 10km; storylines for extremes
- Capability to monitor and assess the quality of the DT simulations
- Capability to stream Earth-system information to selected impact models /use cases included in the DT workflow



WEATHER-INDUCED EXTREMES DIGITAL TWIN









EXTREMES DT : A MAGNIFYING GLASS ON EXTREME WEATHER EVENTS



Global and daily simulations of extreme weather 4 days ahead at 4.4km On-Demand regional simulations 2 days ahead at 750m to 500m

Impact-sector models: user-relevant information for societal impacts

IFS-NEMO







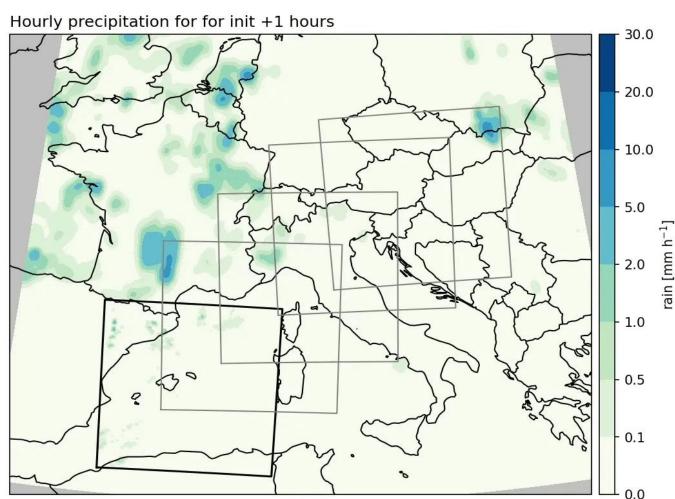
DESTINATION EARTH European Union Implemented by CECMWF COSA CEUMETSAT



Global and daily simulations of extreme weather 4 days ahead at 4.4km



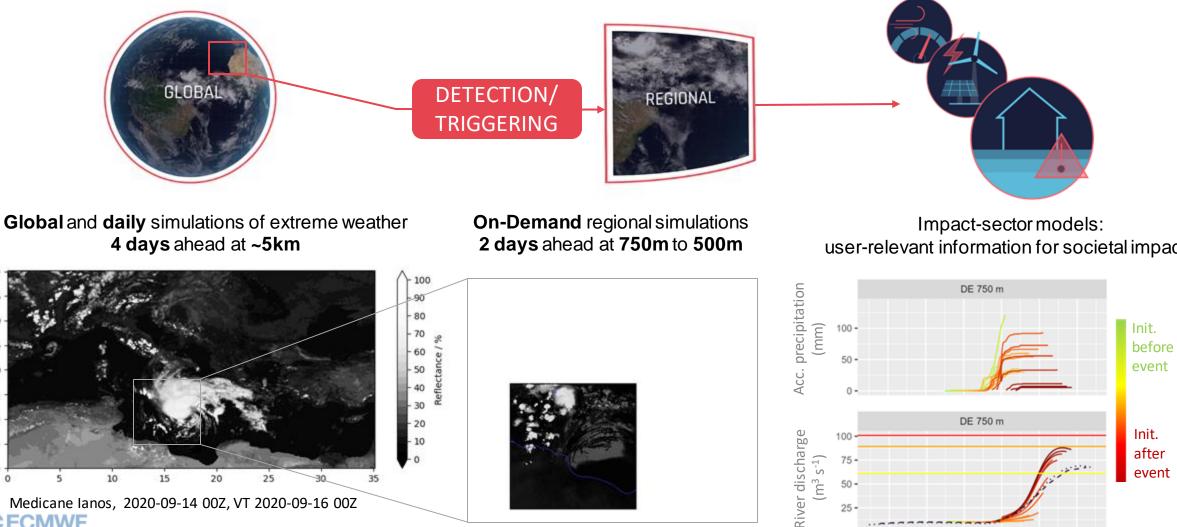




On-Demand regional simulations 2 days ahead at 750m to 500m



EXTREMES DT : A MAGNIFYING GLASS ON EXTREME WEATHER EVENTS



Medicane lanos, 2020-09-14 00Z, VT 2020-09-16 00Z ECMWF

47.5

45.0

42.5

40.0

37.5

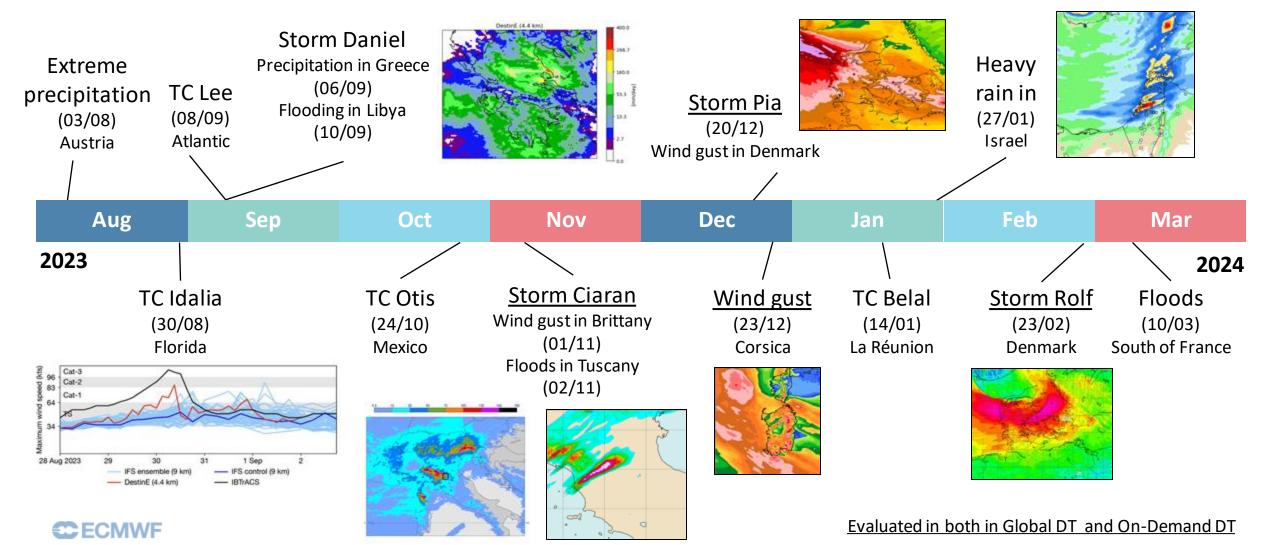
35.0

32.5

30.0

user-relevant information for societal impacts

NOTABLE EVENTS ANALYZED IN THE EXTREMES DT SINCE AUGUST 2023



implemented by CECMWF CESA 🗲 EUMETSAT

450

400 -

tco399

tco1279

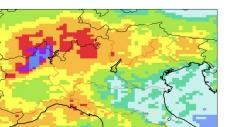
teo 2550

GLOBAL EXTREMES DT

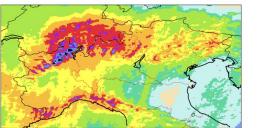
Storm Alex 2020/10/01 24h TP

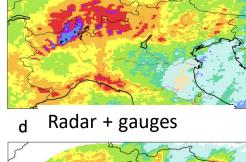
b

ECMWF OPER (9km)

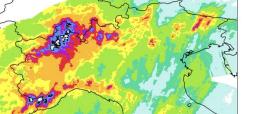


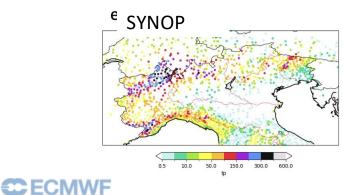
DestinE (2.8km)





DestinE (4.4km)

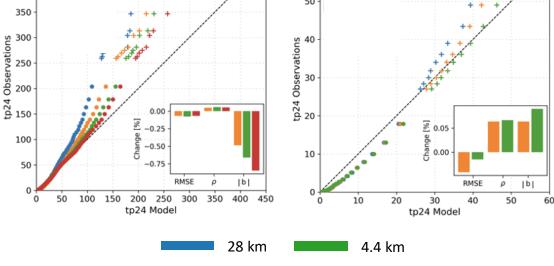




daily forecasts 4 case studies QQ NorthItaly winter sdforHigh tp24 72h 60 tco399 • tco1279 tco2550 50

2.8 km

Winter 2022

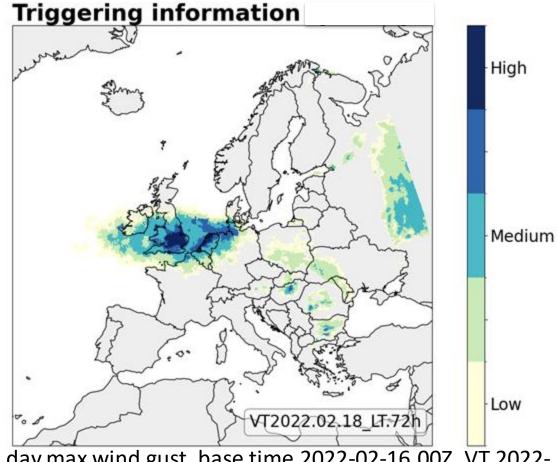


Global Extremes DT workflow deployed on LUMI, in less than a year

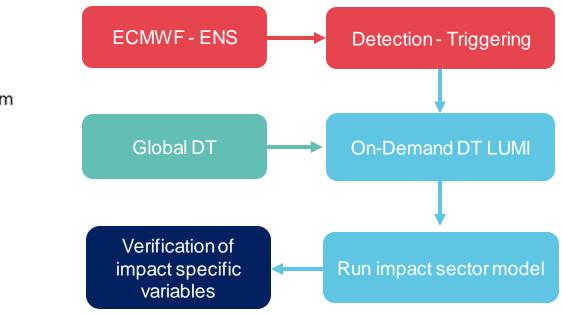
9 km

4-day simulations at 4.4km run a few times per week





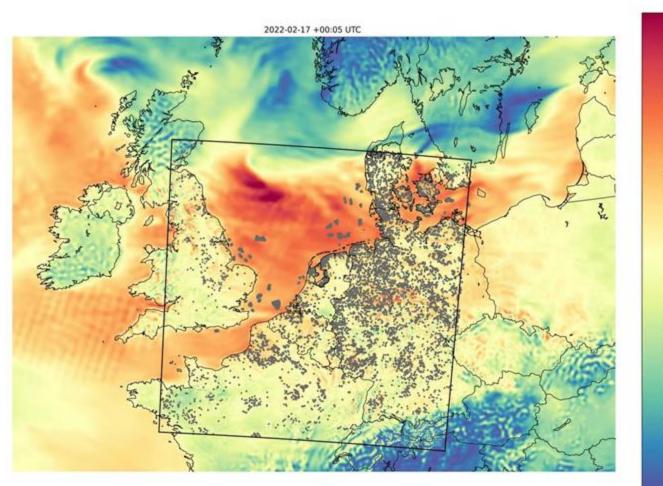
- total precipitation
- CAPE shear
- 10m-wind gust



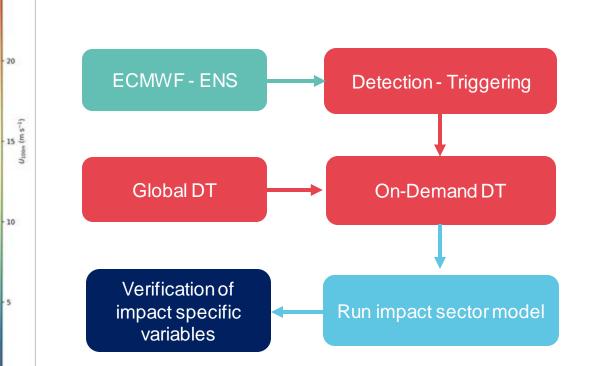
10m day max wind gust, base time 2022-02-16 00Z, VT 2022-02-18 (Step 48-72)

GLOBAL – REGIONAL EXTREMES DT END TO END DEMONSTRATION

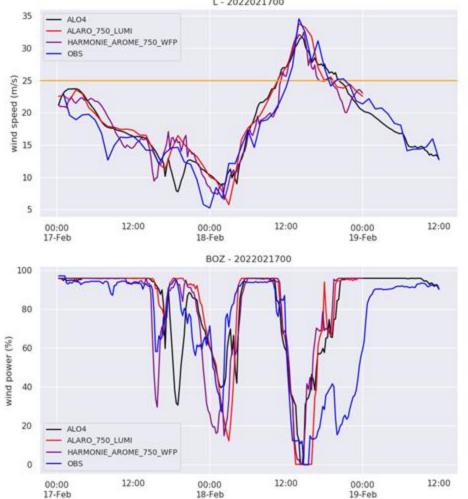
- 25

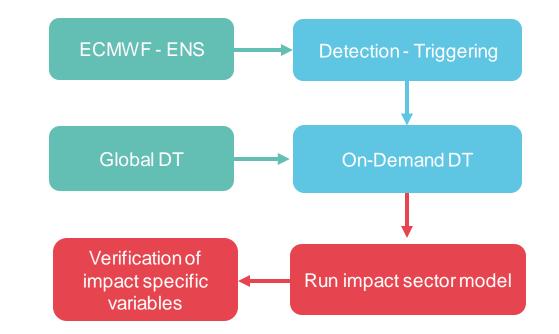


100m wind speed, base time 2022-02-17 00Z, ECMWF lead time T+0 to T+48



GLOBAL – REGIONAL EXTREMES DT END TO END DEMONSTRATION



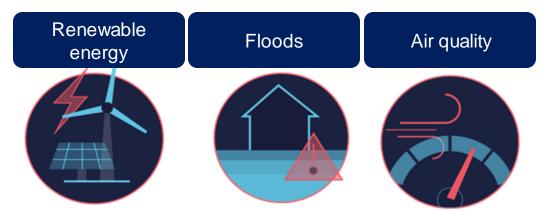


base time 2022-02-17 00Z, lead time T+0 to T+60



EXTREMES DT: PHASE 1 DELIVERY

- Demonstrated regular and on-demand production at enhanced simulation scales (2.8 to 4.4 km globally, 500-700 m regionally) on timescales of 2 to 4 days ahead for selected extreme cases
- Performed the first comprehensive and in near-real time evaluation of global medium-range forecasts at 4.4 km demonstrating clear benefits at local scale (TC, orographic precipitation) - based on daily runs performed on ECMWF Atos since August 2023
- Set-up end-to-end workflows on LUMI to provide extremes information globally, in a continuous mode, and ran regularly global simulations at 4.4km and for 4 days ahead since December 2023
- Setting up end-to-end workflows for the regional, on-demand, component for selected configurations, and including impact sector models for selected use cases, first configurations expected to become available end of 2024



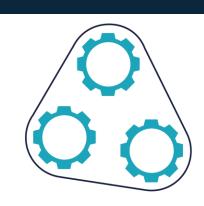






THE DIGITAL TWIN ENGINE

Software environment

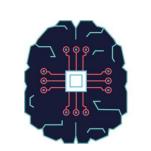




Ensuring complex simulations are run efficiently on EuroHPC



Powering the digital twins and managing big data

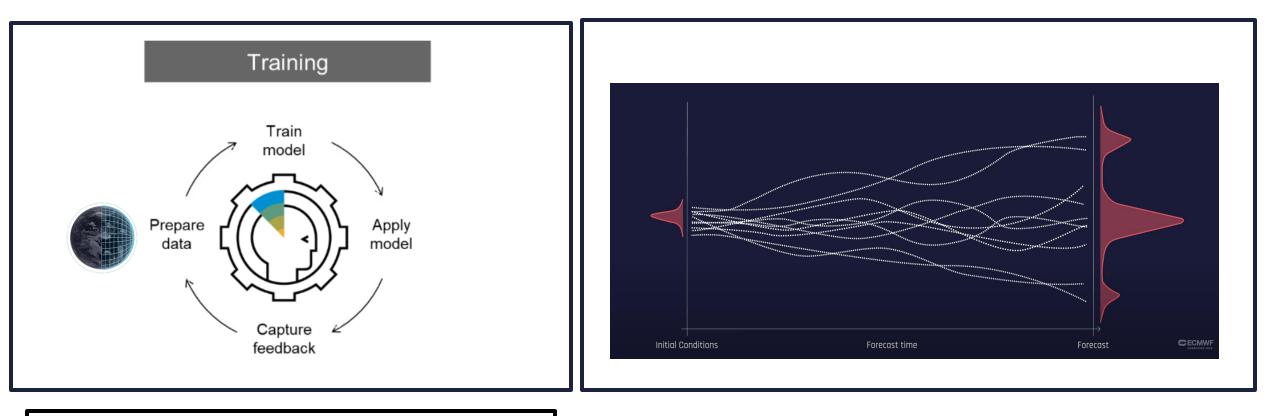


Using ML/AI to increase the efficiency of the digital twins and estimate uncertainty



Tailoring information to user's needs and interactivity

DATA-DRIVEN SIMULATIONS FOR UNCERTAINTY QUANTIFICATION



Al/ML training: 9 Million GPU h ; min. 1 Million GPU h Cost is based on 1 full training per year

AI/ML Inference: 0.1 GPU h cost per use

AI ACTIVITIES IN PHASE 2

Towards a earth-system machine learning model leveraging DestinE data

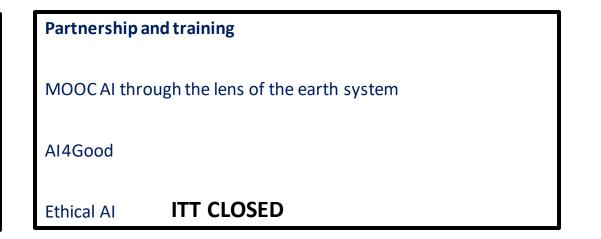
Developing end-to-end workflows for ML model components like land, ocean, sea-ice, hydrology

Using data-driven methods for uncertainty quantification of Extremes and Climate DT

Climate emulator to rapidly explore 'what-if' scenarios

ITT NOW OPEN

Enhanced interactivity
Developing a forecast-in-a-box concept.
ITT OPEN SOON
Building ML demonstrators for impact-sectors (e.g., health, agriculture, urban)
Develop of a weather and climate chatbot
ITT `NOW OPEN



ECMW6

IN CONCLUSION

- Successfully set-up complex Digital Twin workflows and adapted to completely new EuroHPC platforms within less than one year, reaching the maturity levels needed for production at scale
- Demonstrated DTs initial capabilities and piloted km-scale simulations at scale, data production, access and delivery, feeding into selected impact-sector application
- Readiness for DestinE launch event in June 2024
- DestinE complements existing national and EU capabilities and services, and boosts Europe's ability to respond and adapt to extreme events and climate change. Following the principle of subsidiarity (Article 5 of the Treaty on European Union), while DestinE will provide data and tools to predict extreme events at the global and regional scales, it falls within the exclusive competence of Member States' responsibility to provide warnings in their territory in their essential role of protecting life and property.



FOR MORE INFO ON DESTINE'S DTS SEE

https://destination-earth.eu/destination-earth/destines-components/digital-twins-digital-twin-engine/

https://destine.ecmwf.int/digital-twins/

https://stories.ecmwf.int/explainer-digitaltwins/index.html

https://destine.ecmwf.int/news/climate-change-adaptation-digital-twin-a-window-to-the-future-of-our-planet/

https://destine.ecmwf.int/news/the-fast-development-of-destines-climate-change-adaptation-digital-twin/

https://destine.ecmwf.int/news/a-digital-twin-to-sharpen-our-vision-of-extreme-weather/

https://www.bsc.es/news/bsc-news/bsc-key-player-the-development-digital-twin-simulate-future-impacts-climate-change-earth - WATCH THE MOVIES



We acknowledge the EuroHPC Joint Undertaking for awarding this project access to the EuroHPC supercomputer LUMI, Leonardo, MeluXina, through a EuroHPC JU Special Access call.