

DESTINATION EARTH: THE CLIMATE CHANGE ADAPTATION DIGITAL TWIN

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Funded by
the European Union

Destination Earth

implemented by



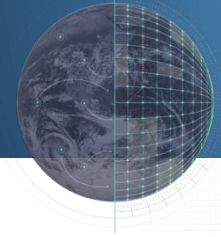
Who we are:

- European Centre for Medium Range Weather Forecasts (**ECMWF**)
- Independent intergovernmental organisation est. 1975
- **23 member states** and **12 co-operating states**
- Duty stations in Reading (HQ), Bonn, Bologna (DC)
- Research institute and 24/7 operational weather centre

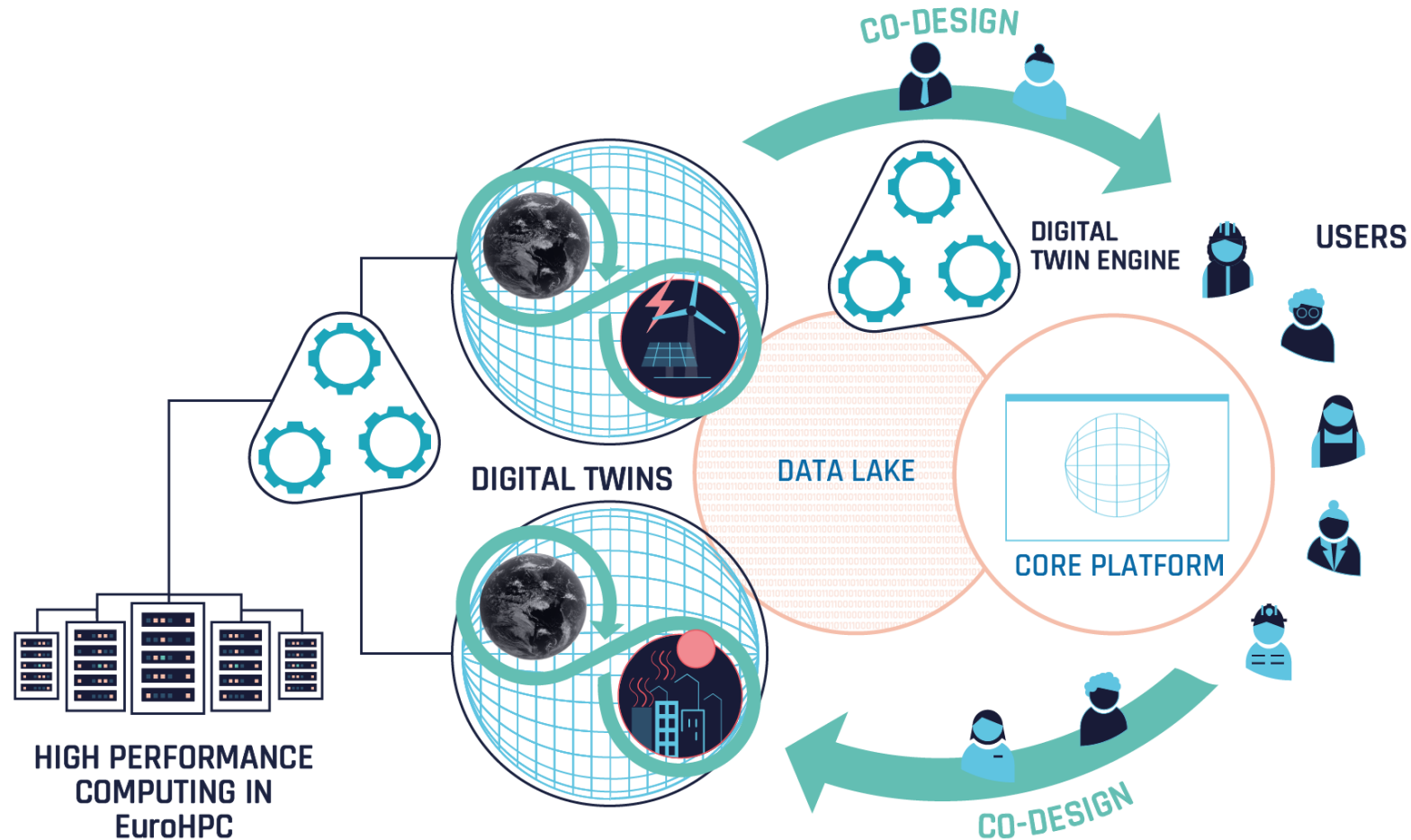
What we do:

- Produce and disseminate global NWP products
- Operate world's largest meteorological data archive
- Deliver Copernicus services (CAMS and C3S)
- Provide computing resources to Member States
- Develop Destination Earth Digital Twins of the Earth and the Digital Twin Engine

ECMWF's role is to address the critical and most difficult research problems in medium-range NWP that no one country could tackle on its own.



A NOVEL INFORMATION SYSTEM





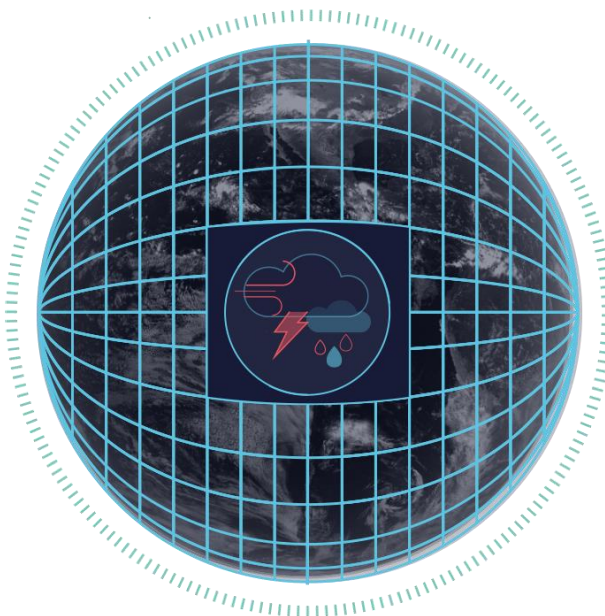
TWO HIGH PRIORITY DIGITAL TWINS

To support decision making for
real-time response to extreme events

To support the efforts of defining and
planning activities linked to climate
change adaptation

Timescale of 2-5
days ahead
(1h to sub-hourly
output)

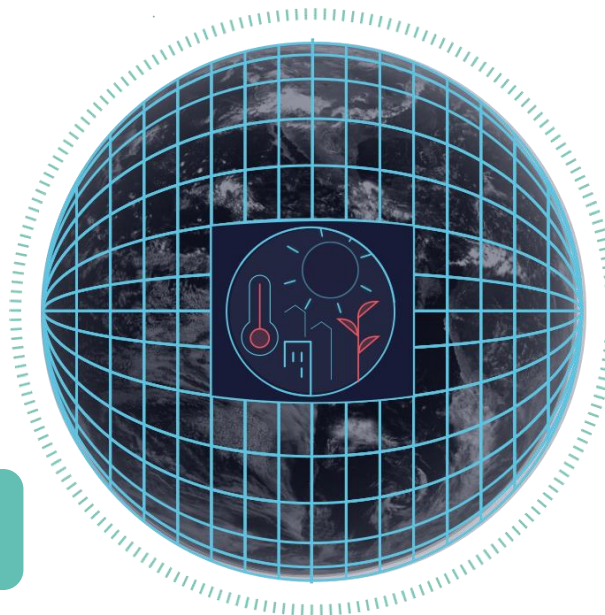
Km-scale resolution
1-4 km globally,
500-750m regionally



Run regularly &
on demand &
configurable

Decision-driven data
analytics

Weather-induced extremes



Multi-decadal timescales
(2020 to ~2050)
(1h to 6 hours output)

Km-scale resolution
globally (5km)

Climate change adaptation



THE CLIMATE CHANGE ADAPTATION DIGITAL TWIN

New type of climate information system used **to assess impacts of climate change and different adaptation strategies** at local and regional levels over multiple decades.

Key features:

- **User-driven** approach focused on **user interactivity**.
- **Global multi-decadal climate simulations** at unprecedented horizontal **resolution**.
- Configurable and scalable **end-to-end workflows**.
- Deployment on **EuroHPC supercomputers across different hardware architectures**.
- Novel approach with **streaming of climate model output to impact models**
- **Quality assessment and uncertainty quantification** based on observations.



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Destination Earth

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ALFRED-WEGENER-INSTITUT
HELMHOLTZ-ZENTRUM FÜR POLAR-
UND MEERESFORSCHUNG



**Barcelona
Supercomputing
Center**
Centro Nacional de Supercomputación

Deutscher Wetterdienst
Wetter und Klima aus einer Hand



HELMHOLTZ



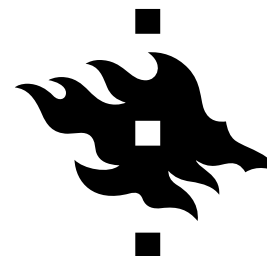
**Hewlett Packard
Enterprise**



ILMATIETEEN LAITOS



**MAX-PLANCK-INSTITUT
FÜR METEOROLOGIE**

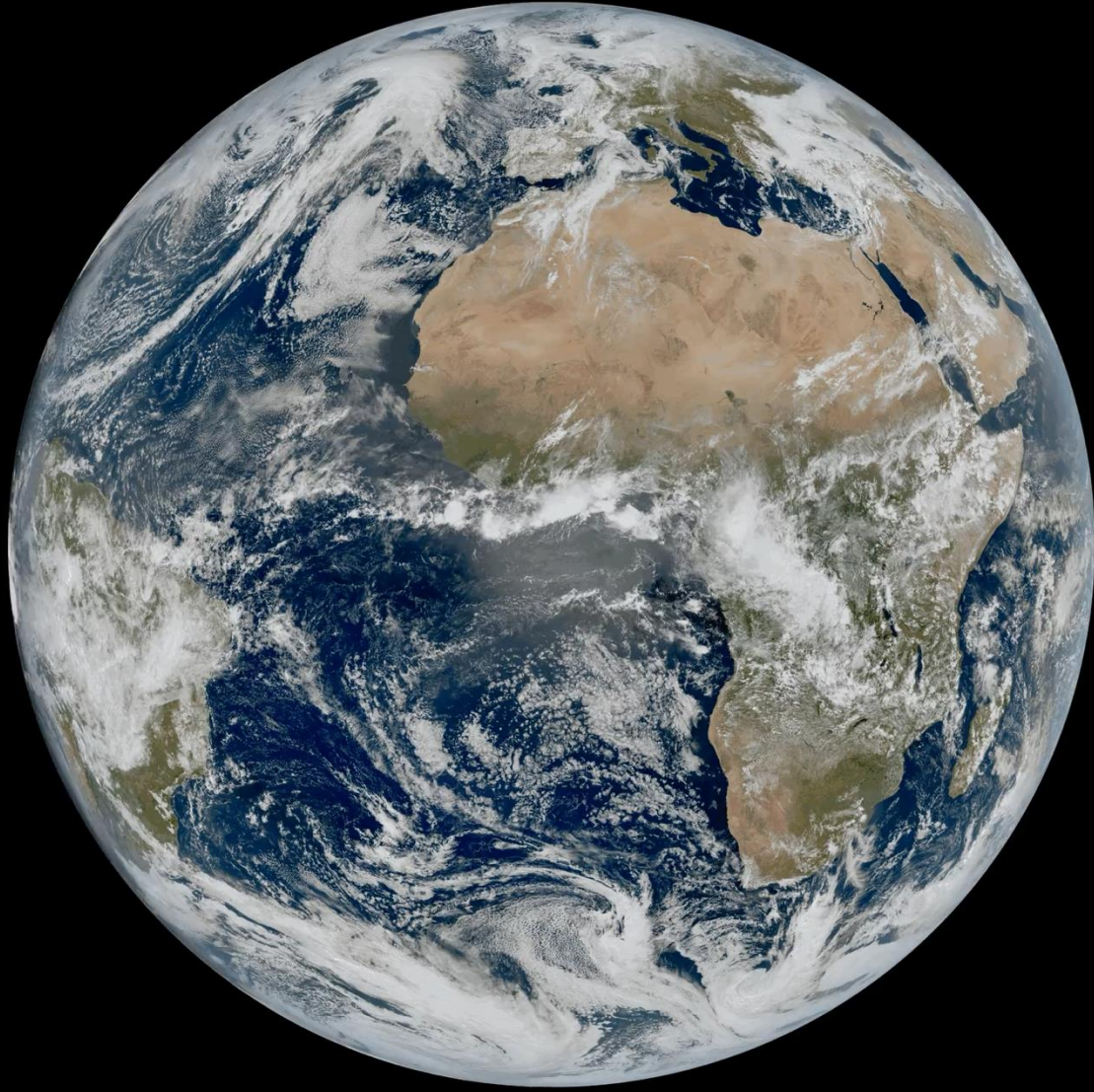


HELSINGIN YLIOPISTO
HELSINGFORS UNIVERSITET
UNIVERSITY OF HELSINKI

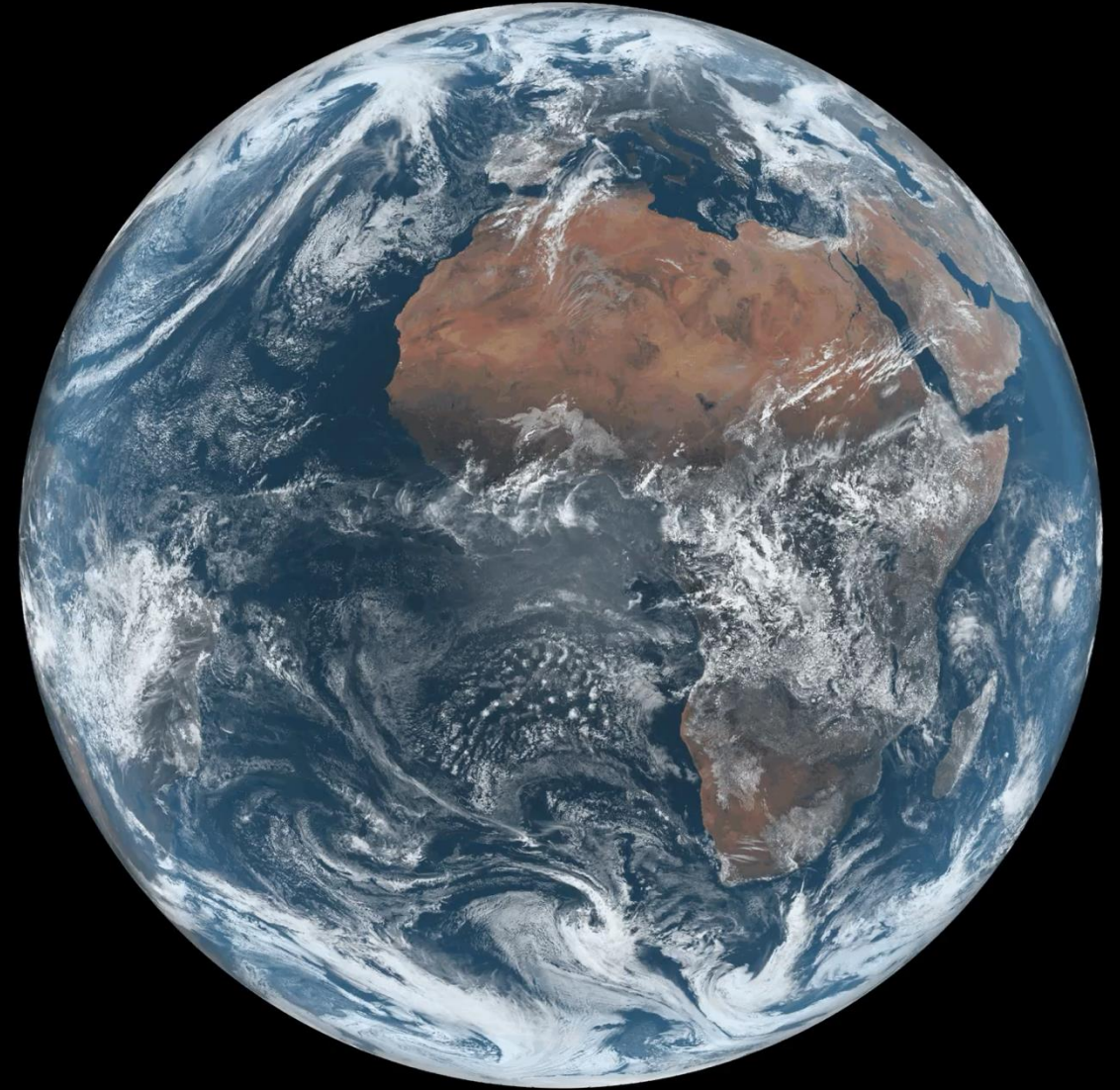


**Politecnico
di Torino**





MTGI observations



ECMWF IFS 2.8km simulation

ICON

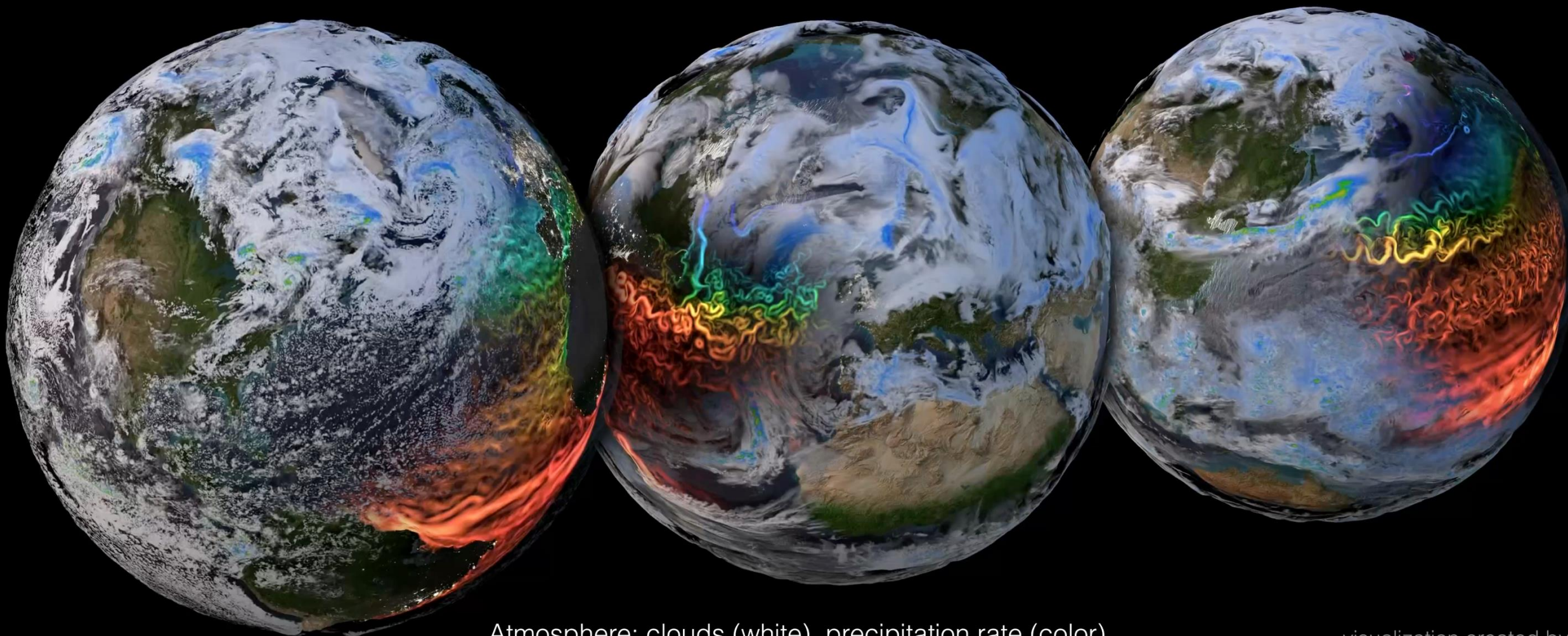
Aug 2039

IFS-FESOM

Jan 2039

IFS-NEMO

Aug 2038

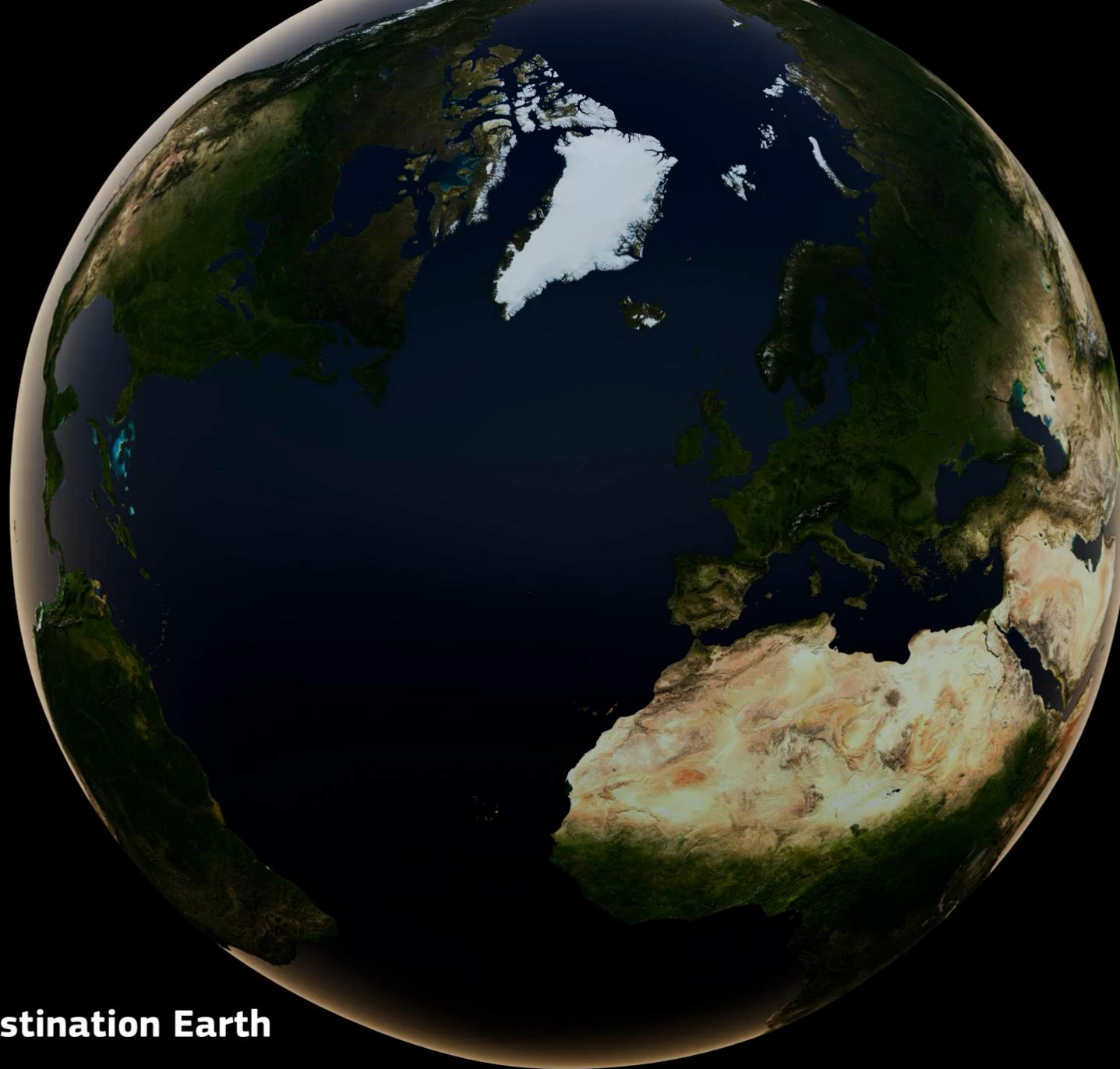


Atmosphere: clouds (white), precipitation rate (color)
Ocean: temperature (color), current speed (brightness)

visualization created by
Andreas Müller (ECMWF)



**Barcelona
Supercomputing
Center**
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Destination Earth



EuroHPC
Joint Undertaking

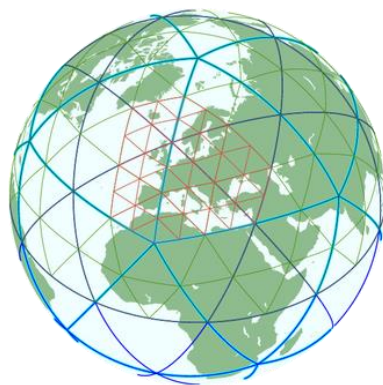
LUMI



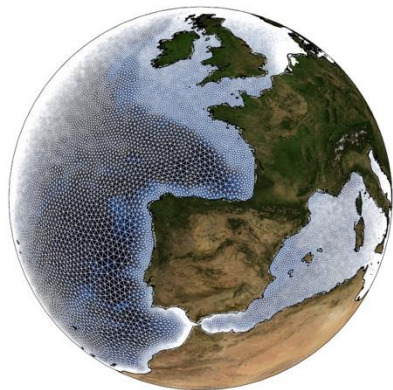
ONE GRID (AND PARAMETER SET) TO RULE THEM ALL



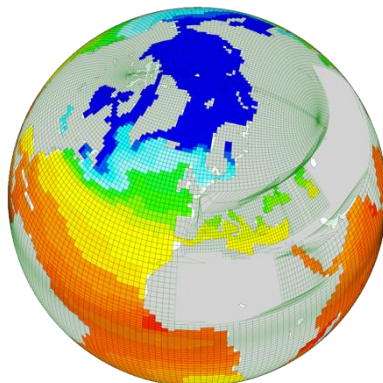
IFS Reduced Gaussian grid



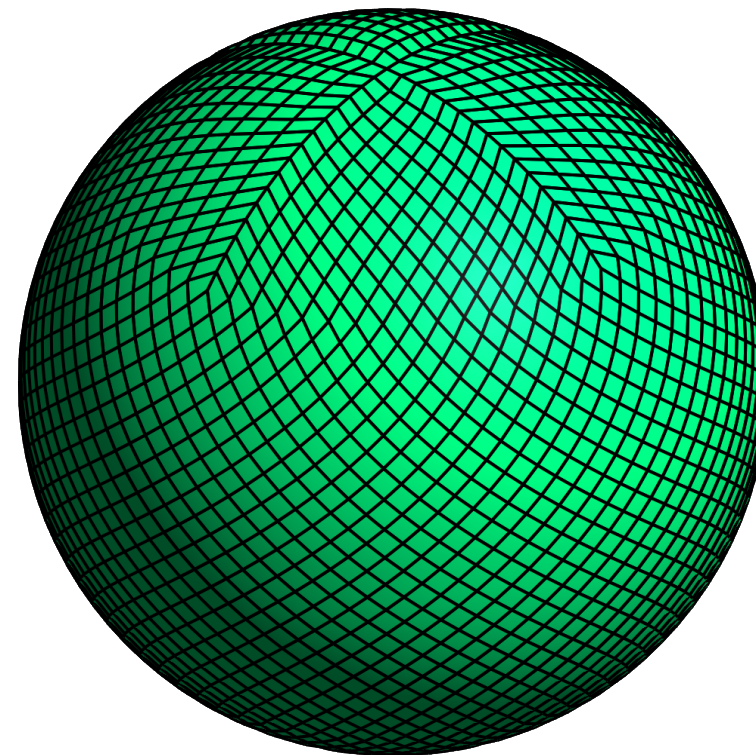
ICON icosahedral grid



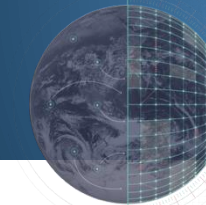
FESOM2 unstructured grid



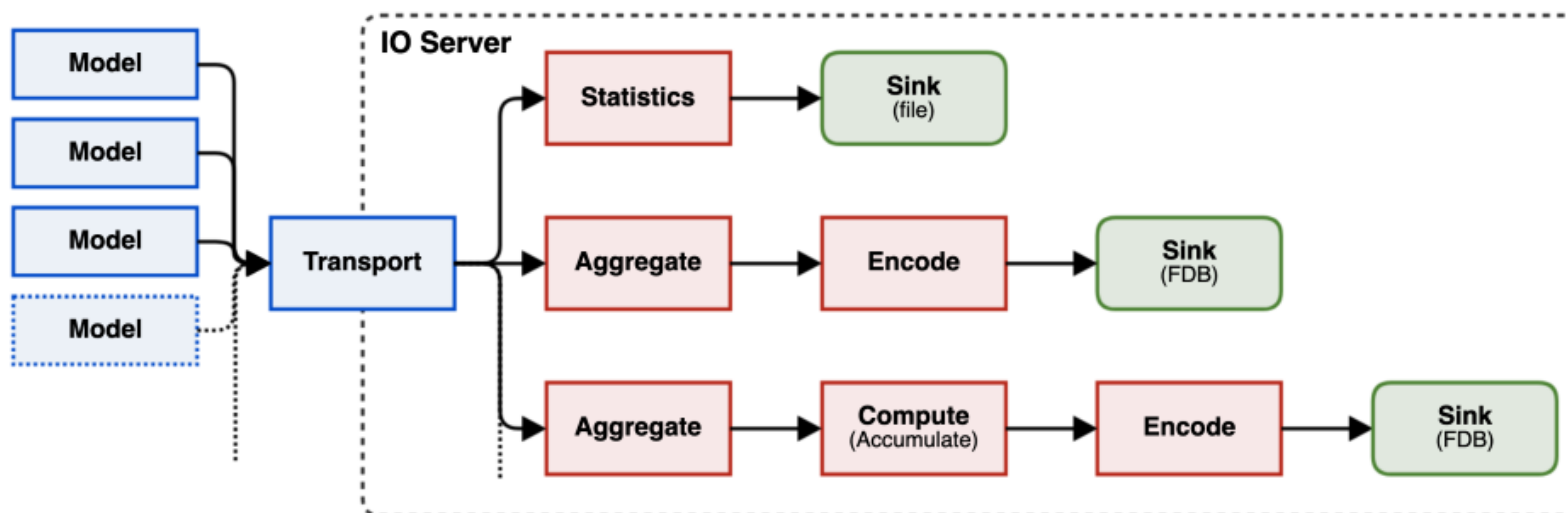
NEMO ORCA grid



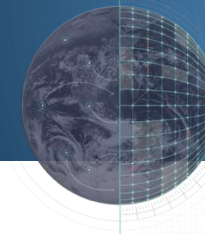
HEALPix grid



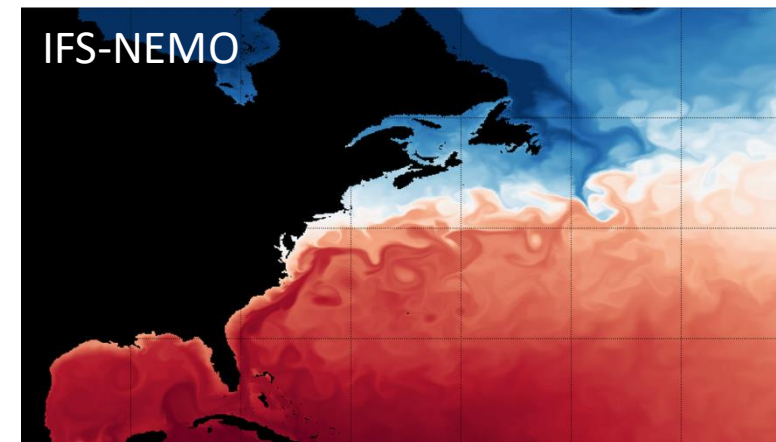
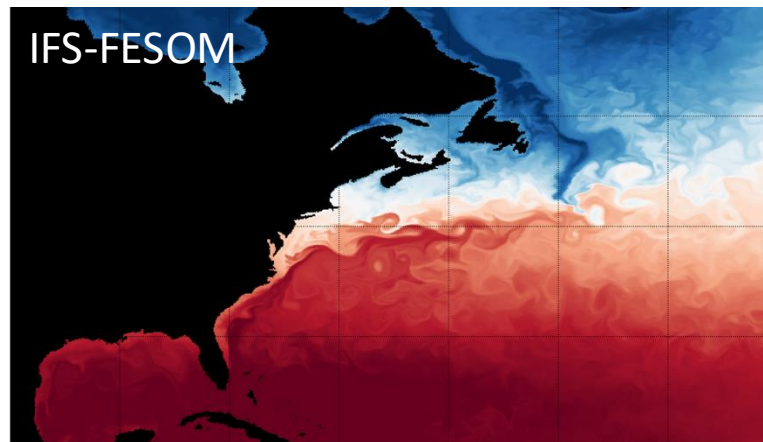
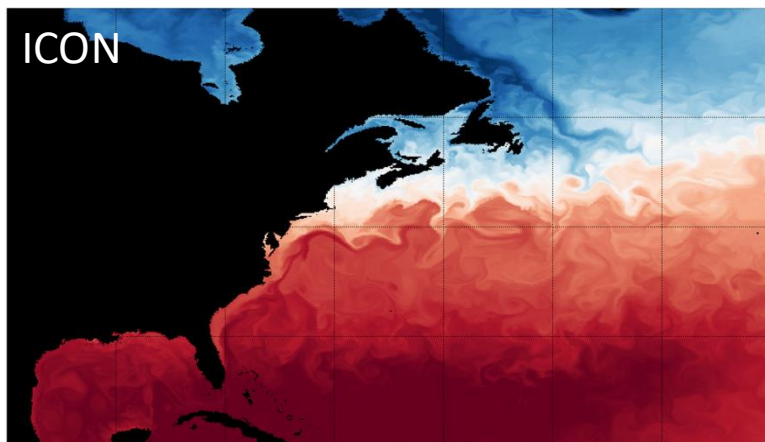
ON-THE-FLY I/O POST-PROCESSING AND STATISTICS



Sarmany et al. (2024), *MultIO: A Framework for Message-Driven Data Routing for Weather and Climate Simulations*, PASC '24. <https://doi.org/10.1145/3659914.3659938>



SNAPSHOTS OF DESTINE CLIMATE PROJECTIONS



Gulf stream in Oct 2034 with ocean potential temperature between 2-4m depth from high-resolution ICON-ocean (left), IFS-FESOM2 (middle) and IFS-NEMO (right) data, with all three consistently stored on the common HEALPix H1024 grid.



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Destination Earth

implemented by



Terminal Shell Edit View Window Help

Mon 20. Oct 16:40

3 Tabs

localhost

Home

Healpix_ocean_example

Climate DT Phase 1 data catalogue - DGOV DestinE collaboration zone ~...

jupyter Healpix_ocean_example Last Checkpoint: 10 minutes ago

File Edit View Run Kernel Settings Help

Trusted

JupyterLab Python 3 (ipykernel)

Example of semantic data access to Climate DT from three different models

```
[ ]: import xarray as xr
import numpy as np
#import gribscan
#import intake
import eccodes
import healpy as hp
import matplotlib.pyplot as plt
import matplotlib.cm as cm
import cartopy.crs as ccr
#import cartopy.feature as cf
#import cartopy.feature as cfeature

[ ]: #ICON
request = {
    "class": "dl",
    "dataset": "climate-dt",
    "activity": "scenariomip",
    "experiment": "ssp3-7.0",
    "realization": "1",
    "generation": "1",
    "model": "icon",
    "resolution": "high",
    "expver": "0001",
    "stream": "clte",
    "date": "20341031",
    "time": "0000",
    "type": "fc",
    "levelist": "2",
    "levtype": "o3d",
    "param": "263501"
}

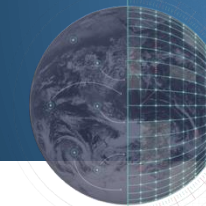
data1 = earthkit.data.from_source("polytope", "destination-earth", request, address="polytope.lur

[ ]: # Celsius
dnp=data1[0].values-273
```

demo — wedi1@jpl-s01-03:~ — zsh — 121x11

...1:~ — zsh ...0:~ — zsh ...ifs — zsh ...cm — zsh ...aw — zsh ...er — zsh ...ut — zsh ...her — zsh ...mo — zsh ...3:~ — zsh

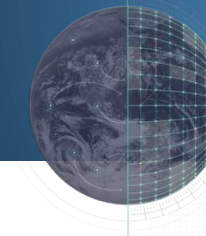
(base) naw@Nilss-MBP-2 demo % conda activate destine



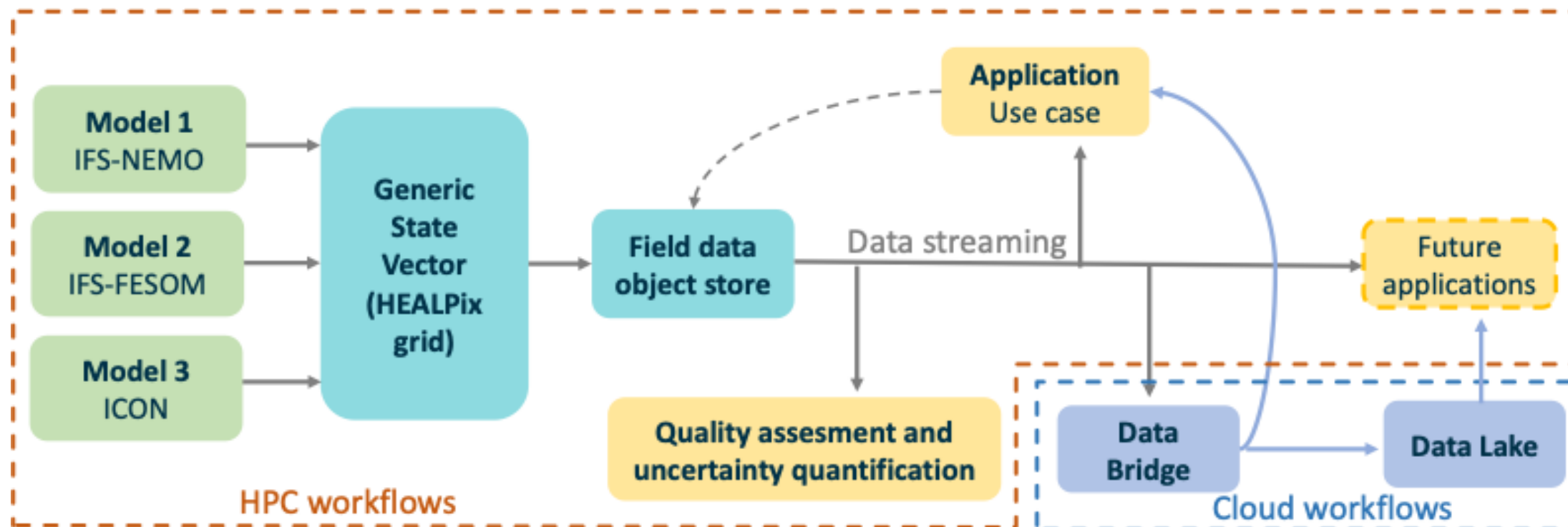
CLIMATE DT SIMULATIONS

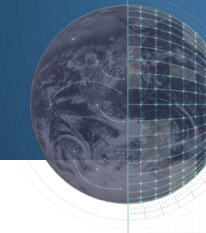
- **Control (10-15 years)**
 - 1990 forcing with no change in forcing over time to quantify model drift and simulated inter-annual variability
 - Provide relevant context for interpreting historical and scenario simulations
- **Historical (20-30 years)**
 - Starting in 1990, the forcing follows observed changes in greenhouse gases, aerosols etc. until 2020
 - Standardised CMIP6 forcing
 - Essential for model evaluation and quality control as it allows comparison to observations.
- **Future Projection (20-35 years)**
 - Project how climate will change on a global and local scale in the future
 - Forcing changes according to the Shared Socioeconomic Pathway (SSP) 3-7.0 scenario from ScenarioMIP
- **Storylines for past, present, future climate (8 years)**
 - What-if capability to explore how a weather event we experienced in the recent past would change in a warmer climate

Type of simulation	Model	Resolution (km)		Period	System	Number of nodes	Output (TB)	Progress
		atmosphere	ocean					
Phase 1								
Future projection	ICON	5	5	2020-2039	LUMI-G	158	840	<div><div></div></div> 100%
Future projection	IFS-NEMO	4.4	8.3	2020-2039	LUMI-C	215	840	<div><div></div></div> 100%
Future projection	IFS-FESOM	4.4	5	2020-2039	MN5-GPP	284	840	<div><div></div></div> 100%
Historical simulation	ICON	10	5	1990-2019	LUMI-G	106	315	<div><div></div></div> 100%
Historical simulation	IFS-NEMO	9	8.3	1990-2001	LUMI-C	256	126	<div><div></div></div> 100%
Storyline simulation (past)	IFS-FESOM	9	5	2017-2024	LUMI-C	201	84	<div><div></div></div> 100%
Storyline simulation (present)	IFS-FESOM	9	5	2017-2024	LUMI-C	201	84	<div><div></div></div> 100%
Storyline simulation (future)	IFS-FESOM	9	5	2017-2024	LUMI-C	201	84	<div><div></div></div> 100%
Control simulation	IFS-NEMO	9	8.3	15 years	LUMI-C	256	262	<div><div></div></div> 100%
Control simulation	IFS-FESOM	9	5	17 years	MN5-GPP	284	157	<div><div></div></div> 100%
Phase 2								
Historical simulation	IFS-NEMO	4.4	8.3	1990-2014	MN5-GPP	260	1051	<div><div></div></div> 100%
Historical simulation	IFS-FESOM	4.4	5	1990-2014	LUMI-C	279	1051	<div><div></div></div> 100%
Historical simulation	ICON	5	5	1990-2014	LUMI-G	106	315	<div><div></div></div> 100%
Control simulation	ICON	5	5	10 years	LUMI-G	128	438	<div><div></div></div> 100%
Control simulation	IFS-FESOM	4.4	5	10 years	LUMI-C	279	438	<div><div></div></div> 100%
Control simulation	IFS-NEMO	4.4	8.3	15 years	MN5-GPP	248	262	<div><div></div></div> 100%
Future projection	IFS-NEMO	4.4	8.3	2015-2049	MN5-GPP	260	1260	<div><div></div></div> 57%
Future projection	IFS-FESOM	4.4	5	2015-2049	LUMI-C	279	1260	<div><div></div></div> 60%
Future projection	ICON	5	5	2015-2049	LUMI-G	128	1008	<div><div></div></div> 7%

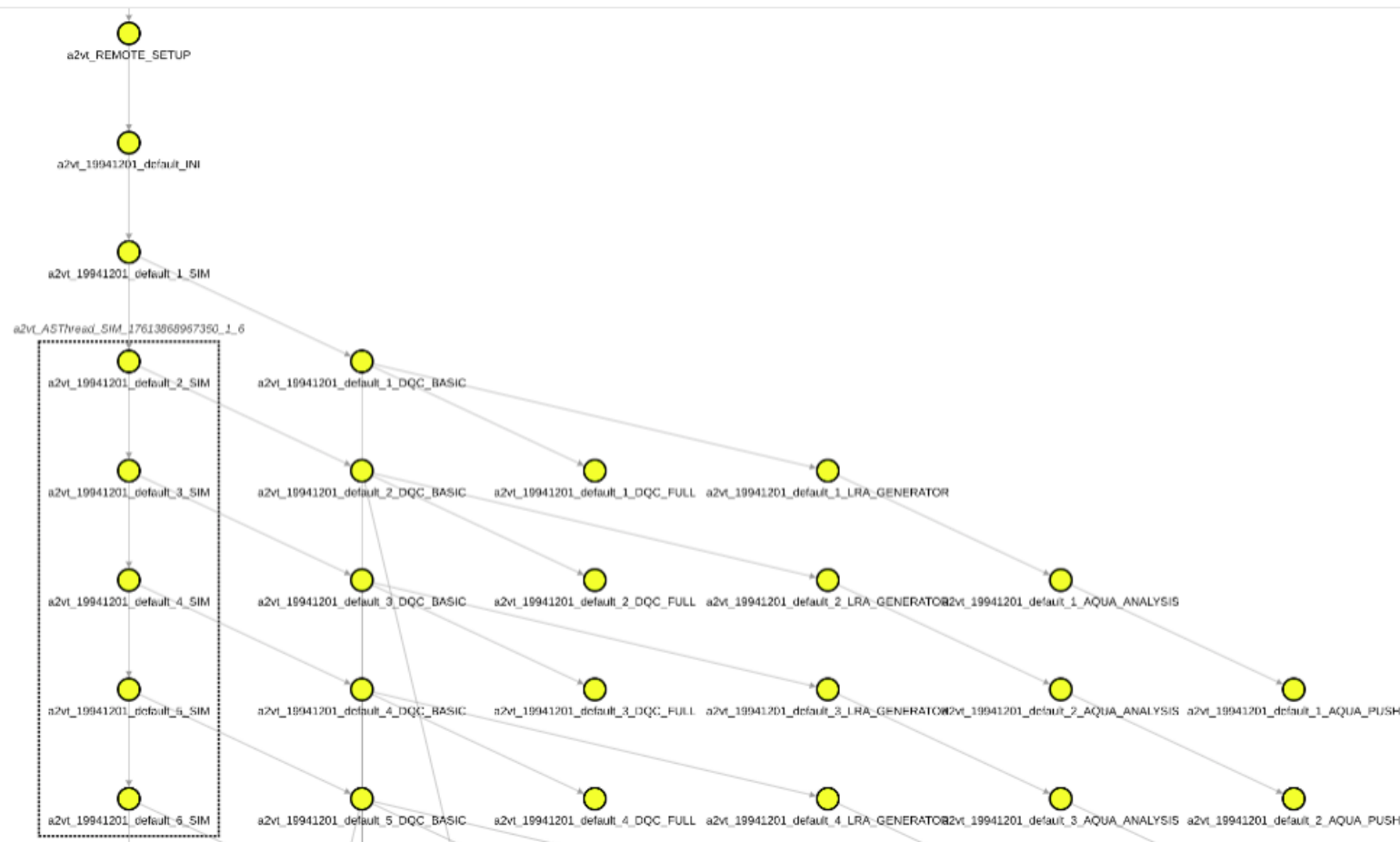


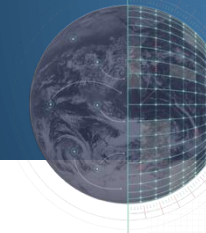
CLIMATE DT WORKFLOWS



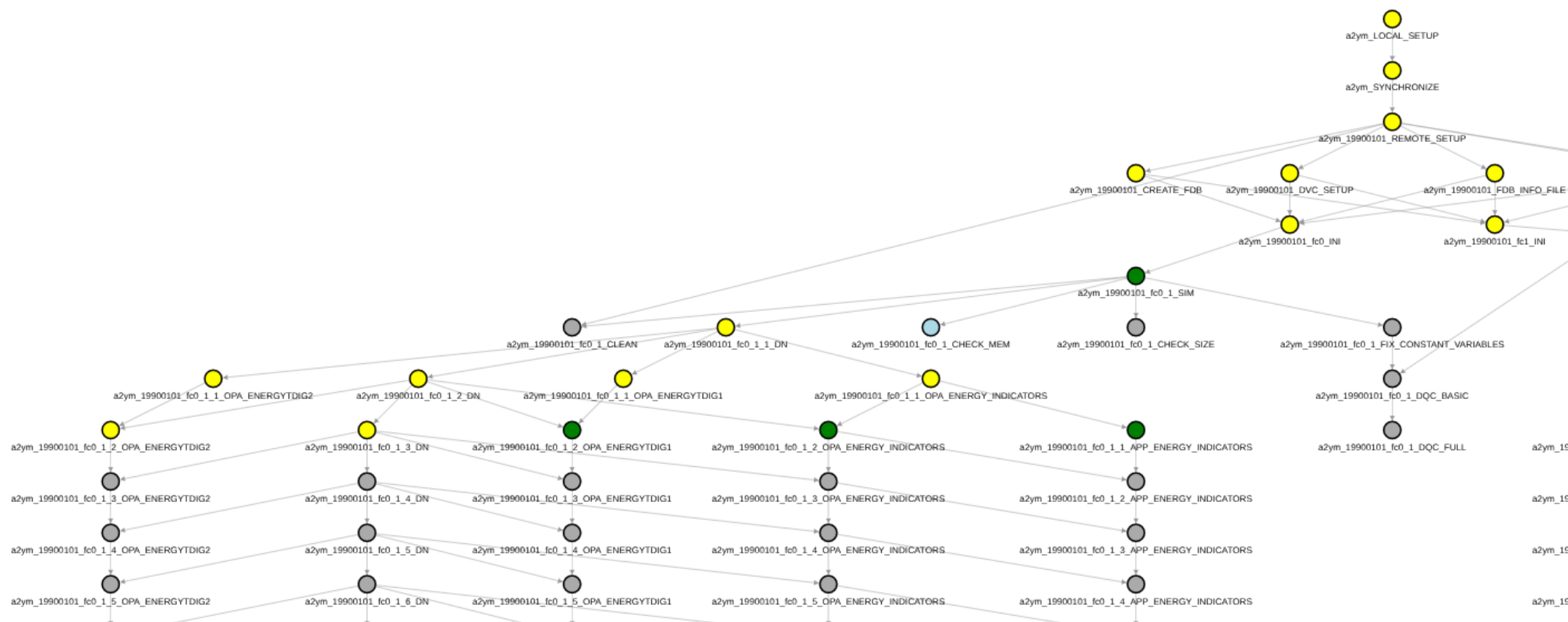


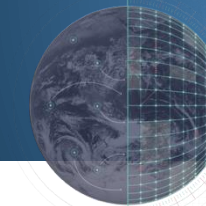
CLIMATE DT WORKFLOWS





CLIMATE DT WORKFLOWS





CLIMATE DT ON EUROHPC



Image courtesy of CSC

LUMI (CSC) – HPE Cray EX

- Slingshot 11 high-speed interconnect
- GPU partition (LUMI-G)
 - 2978 nodes with 4 AMD MI250X GPUs
- CPU partition (LUMI-C)
 - 2048 nodes with 2 64-core AMD EPYC 7763 (Milan) CPUs

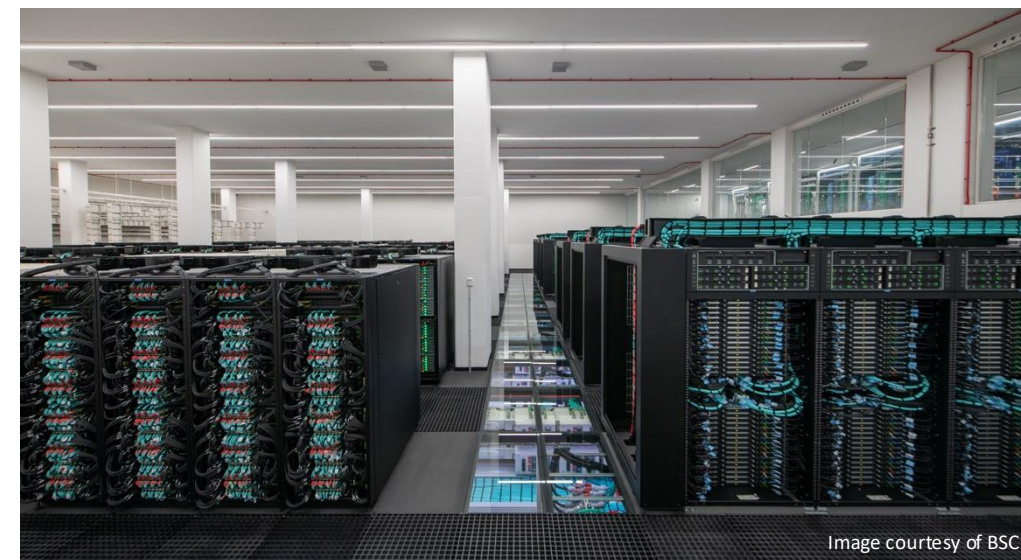
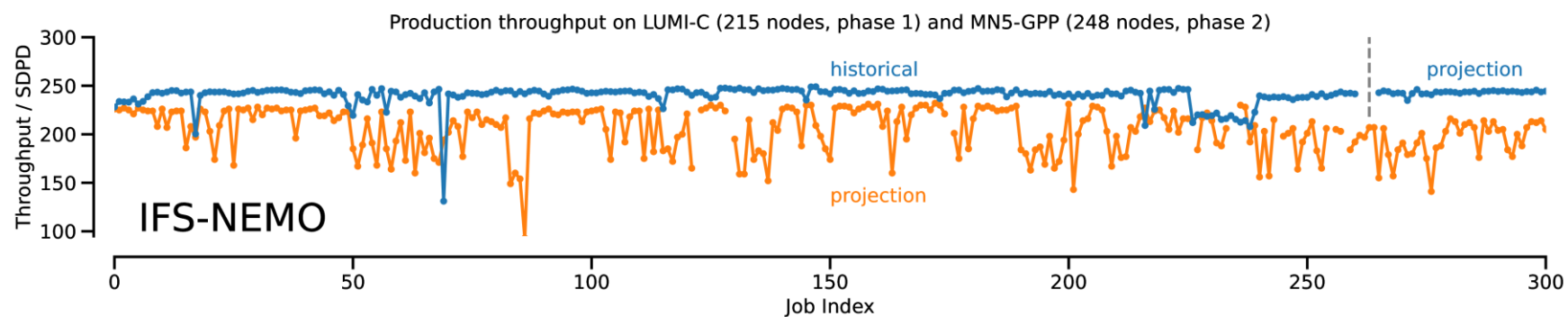
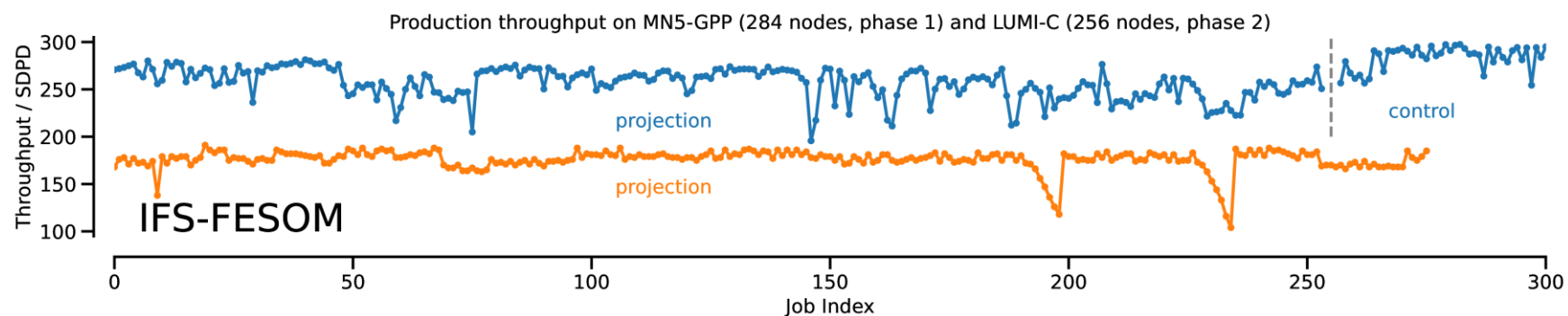
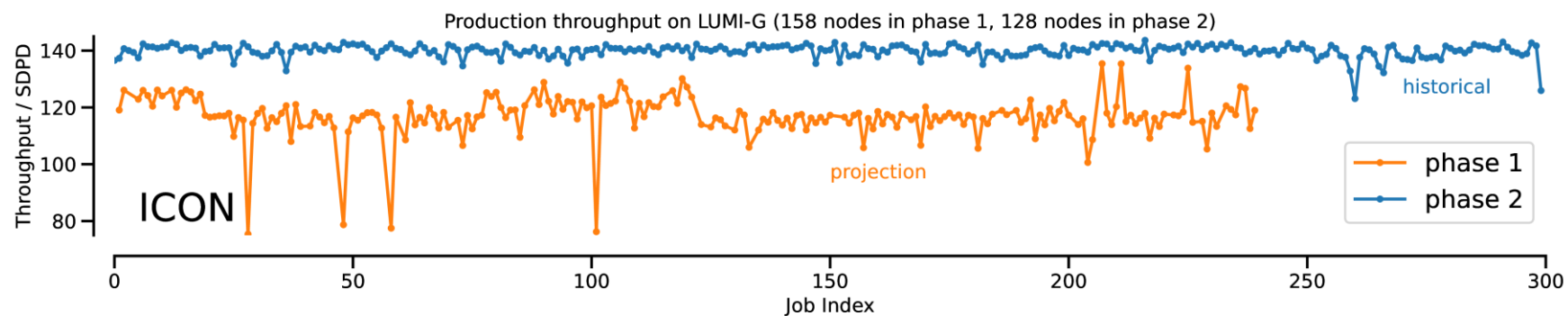
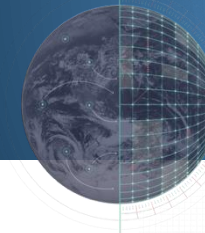


Image courtesy of BSC

MareNostrum 5 (BSC) – Eviden Bullsequana XH3000 and Lenovo ThinkSystem

- NDR Infiniband
- GPU partition (MN5-ACC)
 - 1120 nodes with 4 NVIDIA H100 GPUs
- CPU partition (MN5-GPP)
 - 6480 nodes with 2 56-core Intel Sapphire Rapids 8480+ CPUs

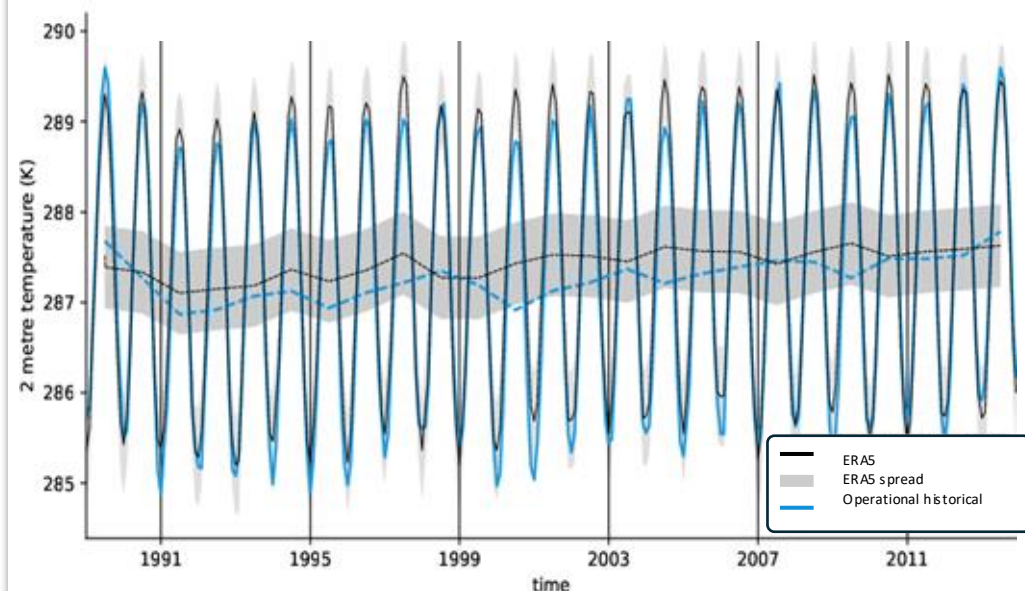




AQUA: REAL TIME MODEL EVALUATION

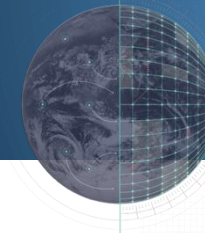
5km simulation IFS-NEMO

Evolution of global mean surface temperature



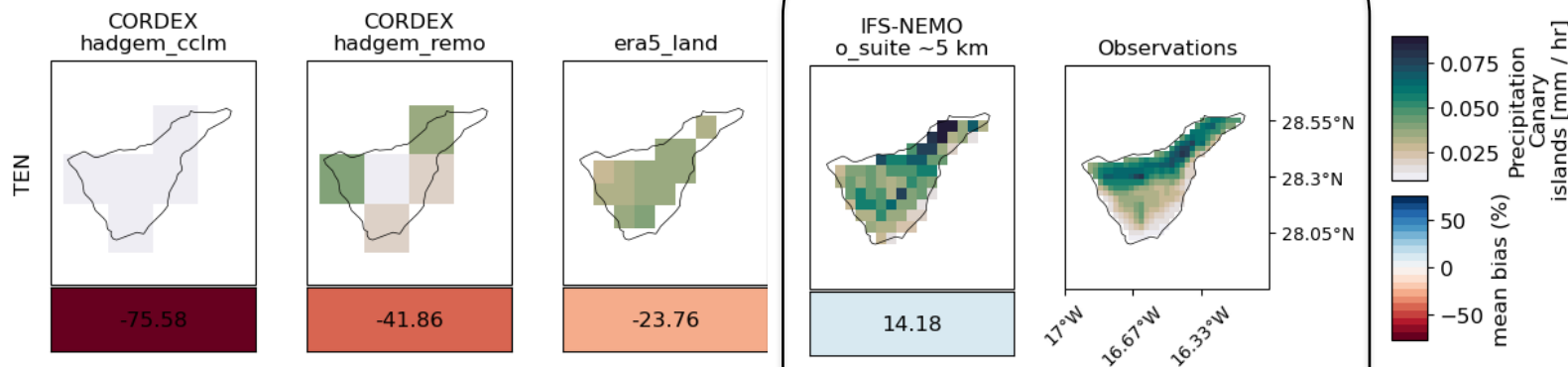
Model Performance Table

	ALL Global	ALL North Midlat	ALL Tropical	ALL South Midlat	DJF Global	DJF North Midlat	DJF Tropical	DJF South Midlat	JJA Global	JJA North Midlat	JJA Tropical	JJA South Midlat
Net surface radiation	0.82	0.82	0.68	0.99	1.14	0.86	0.50	1.59	0.74	0.58	0.76	0.82
2m Temperature (land-only)	0.41	0.38	0.43	0.36	0.47	0.55	0.45	0.33	0.50	0.45	0.51	0.51
Precipitation	0.23	0.37	0.20	0.22	0.17	0.43	0.12	0.25	0.11	0.24	0.09	0.29
Mean Sea Level Pressure	0.18	0.14	0.19	0.12	0.22	0.23	0.20	0.38	0.19	0.15	0.21	0.15
Eastward wind stress	0.14	0.45	0.11	0.09	0.16	0.41	0.12	0.12	0.16	0.56	0.12	0.13
Northward wind stress	0.19	0.54	0.12	0.28	0.20	0.71	0.09	0.36	0.18	0.33	0.14	0.28
Air Temperature	0.14	0.07	0.17	0.16	0.12	0.09	0.12	0.13	0.15	0.09	0.18	0.16
Zonal Wind	0.11	0.17	0.12	0.05	0.32	0.19	0.59	0.13	0.14	0.13	0.13	0.19
Meridional Wind	0.12	0.12	0.18	0.08	0.37	0.10	0.43	0.43	0.16	0.18	0.20	0.08
Specific humidity	0.01	0.01	0.02	0.01	0.02	0.01	0.03	0.04	0.02	0.03	0.02	0.01
Sea Surface Temperature	0.27	0.23	0.59	0.17	0.32	0.26	0.53	0.24	0.25	0.26	0.47	0.14
Sea Surface Salinity	0.16	0.08	0.31	0.30	0.14	0.07	0.25	0.30	0.18	0.09	0.35	0.28
Sea-ice Concentration	0.28	0.58		0.22	0.77	0.56		0.91	0.33	0.61		0.29
Total PI	0.24	0.31	0.26	0.24	0.34	0.34	0.29	0.40	0.24	0.28	0.27	0.26

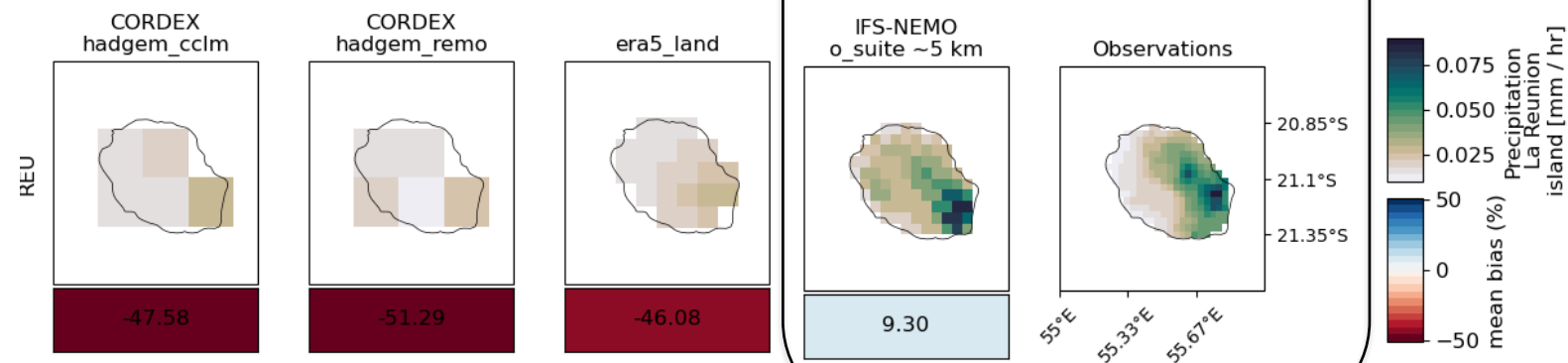


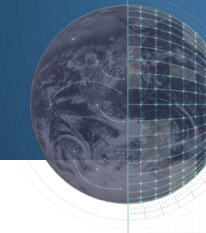
MODEL EVALUATION AGAINST OBSERVATIONS

Tenerife, the Canary Islands



Reunion, the Mascarene Islands





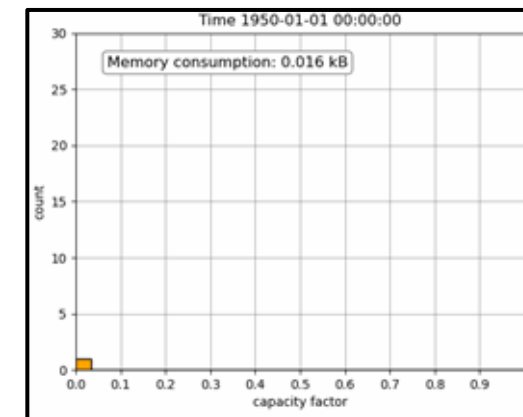
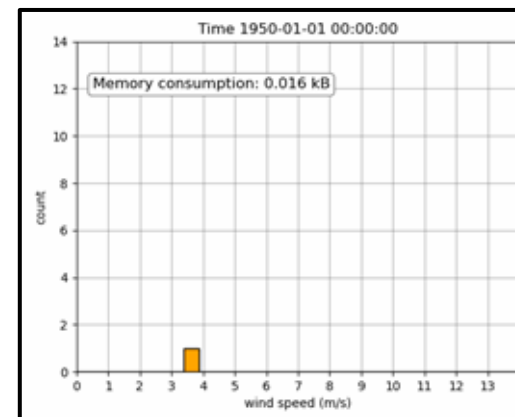
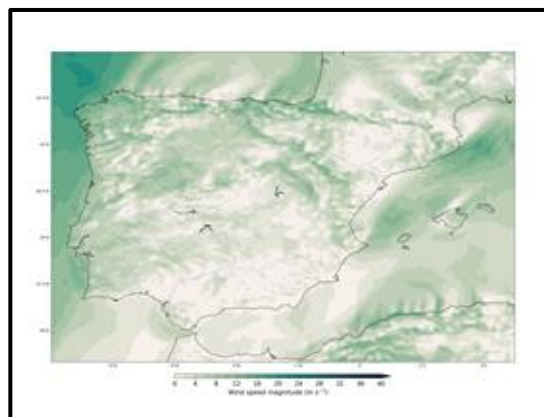
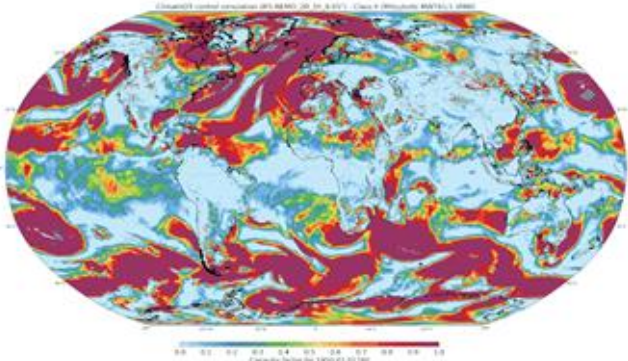
ONE-PASS ALGORITHMS (OPA)

Model outputs **raw**
climate variables

Data notifier triggers
application workflow. **Spatial**
selection of specific variables

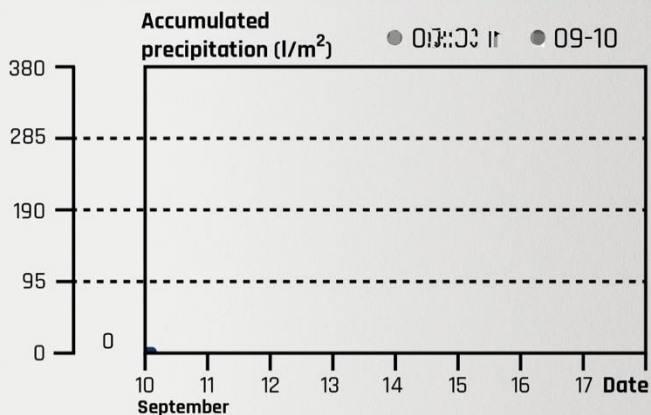
One-pass algorithms
compute distribution of
weekly wind speed

Use case applications
compute climate
indicators
Weekly CF = 0.3861

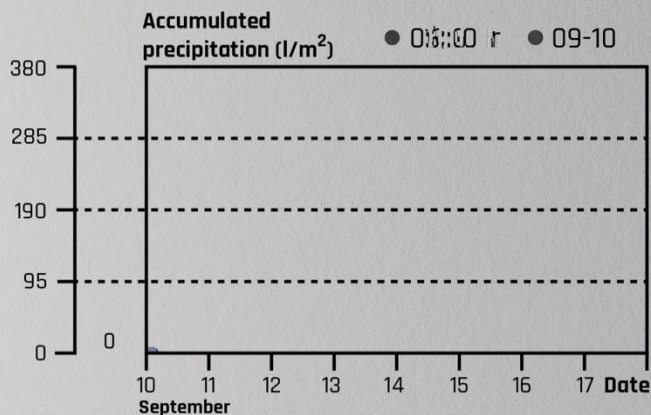




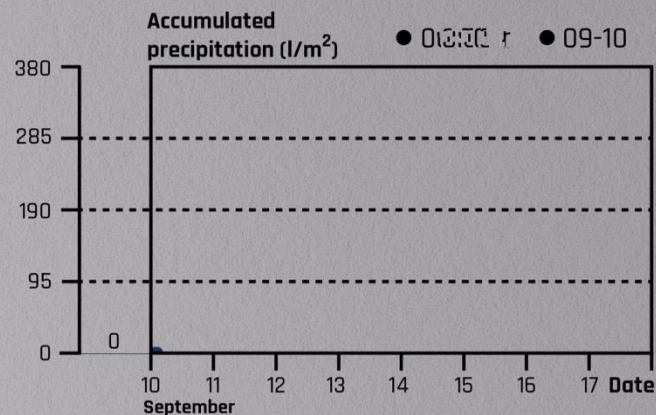
Climate	Past (1950)
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Climate	Present (+1.2°C)
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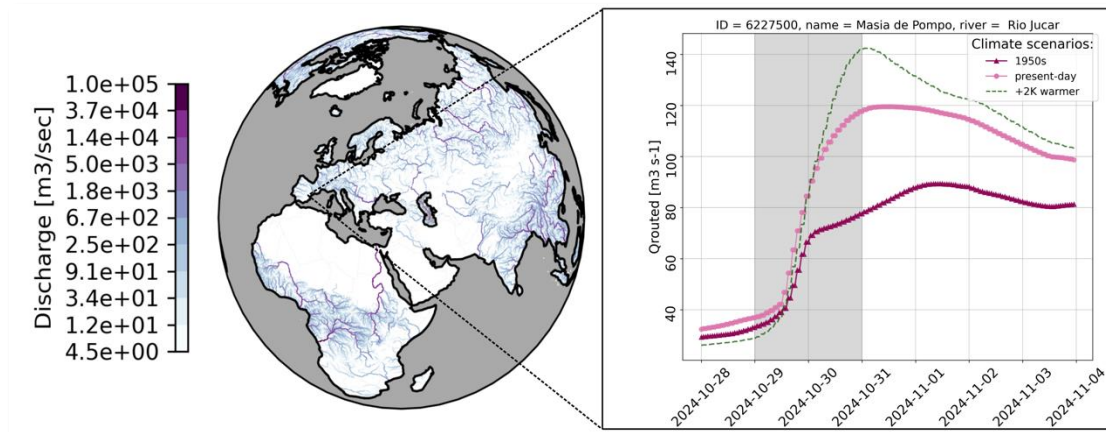
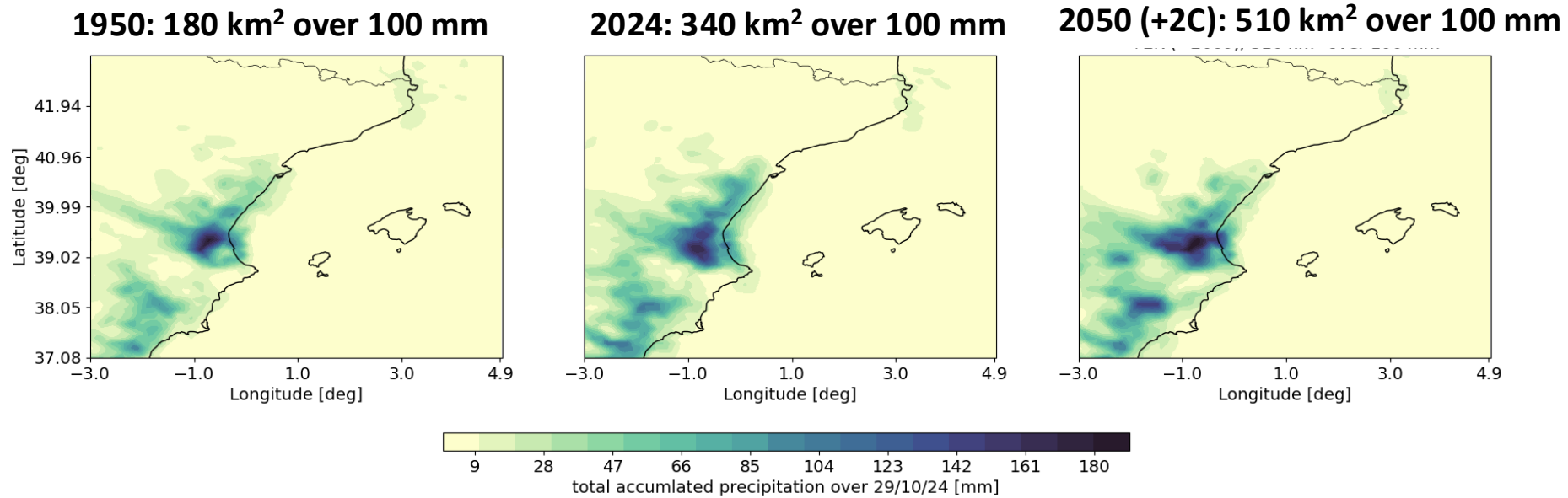


Climate	Future (+2°C)
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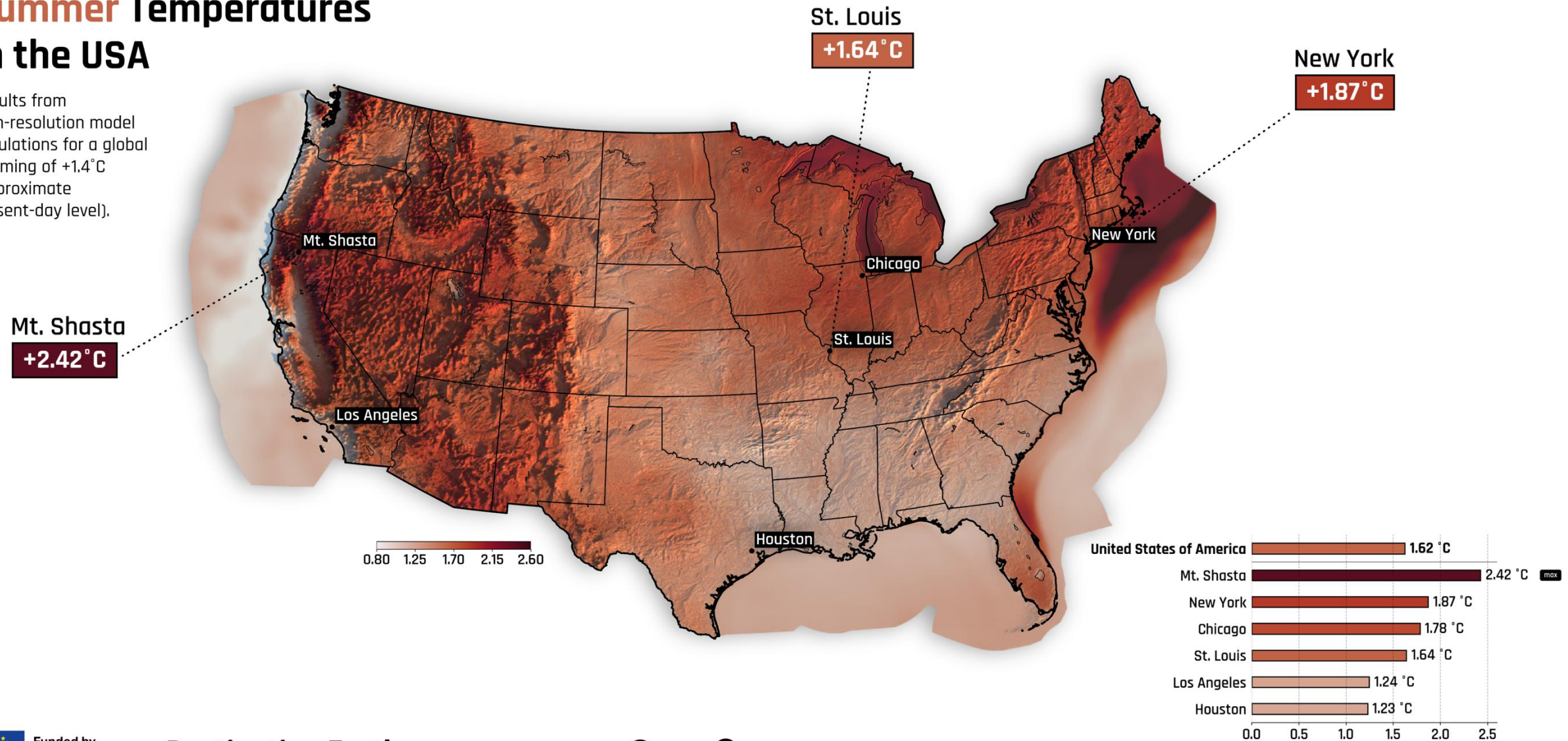


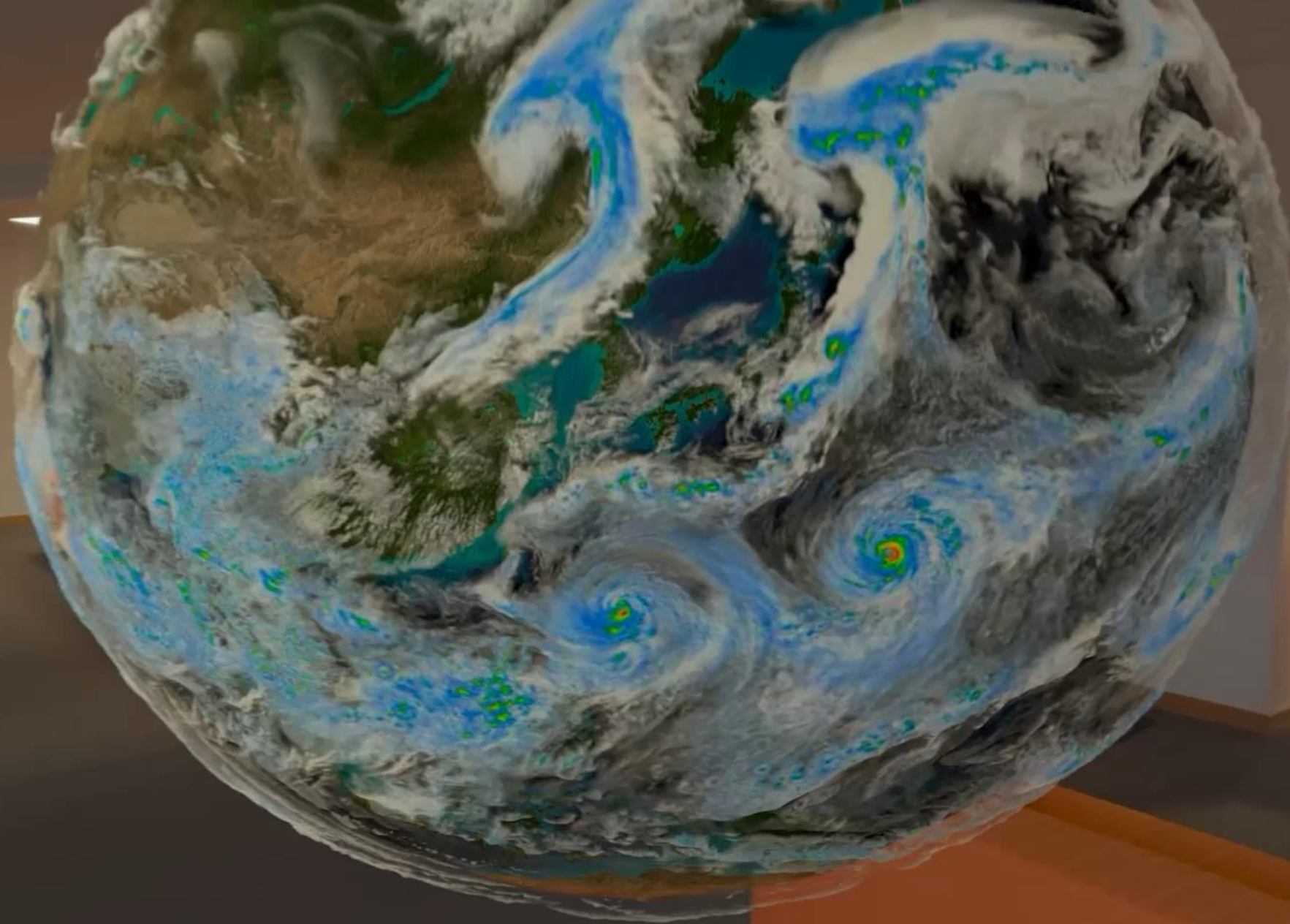
REPLAYING THE 2024 VALENCIA FLOODS

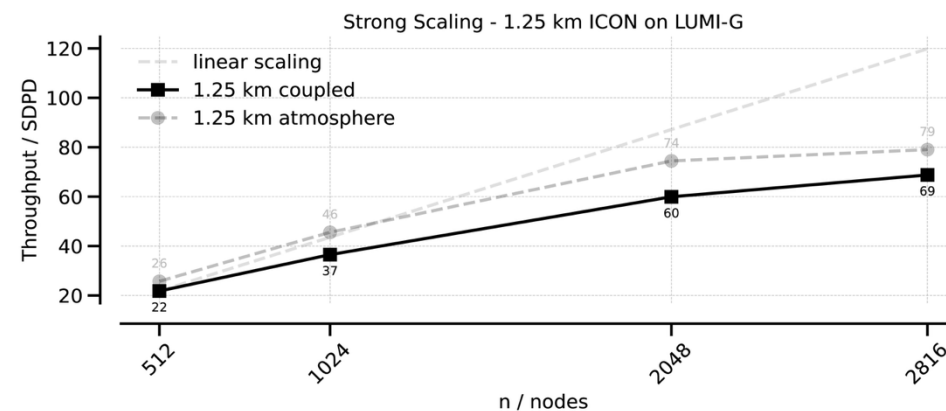
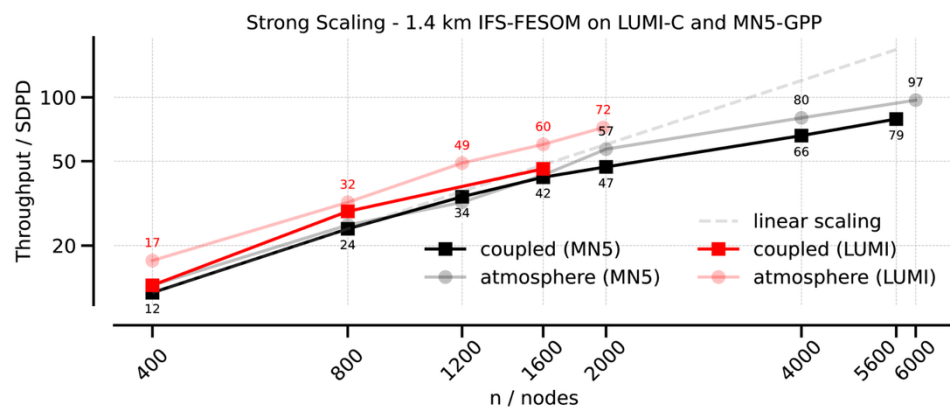
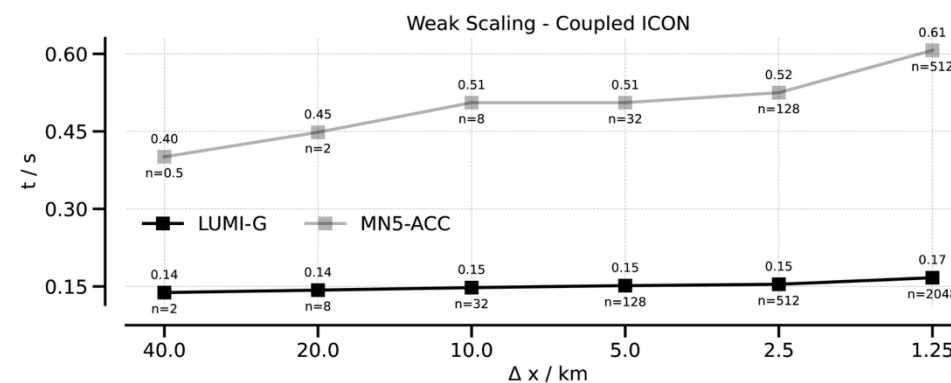
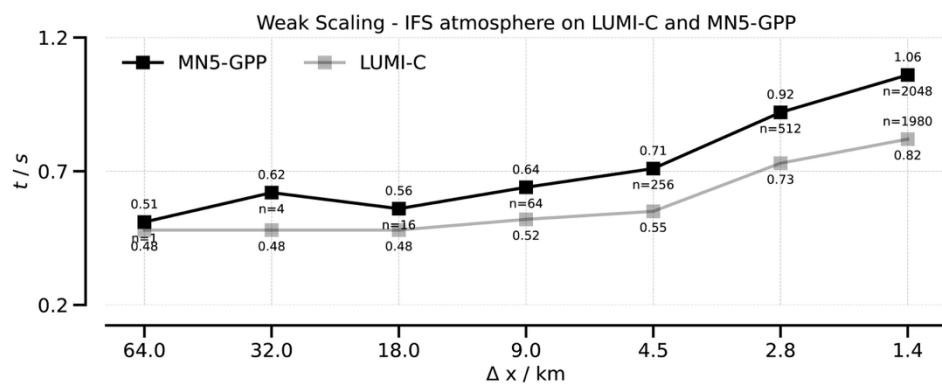
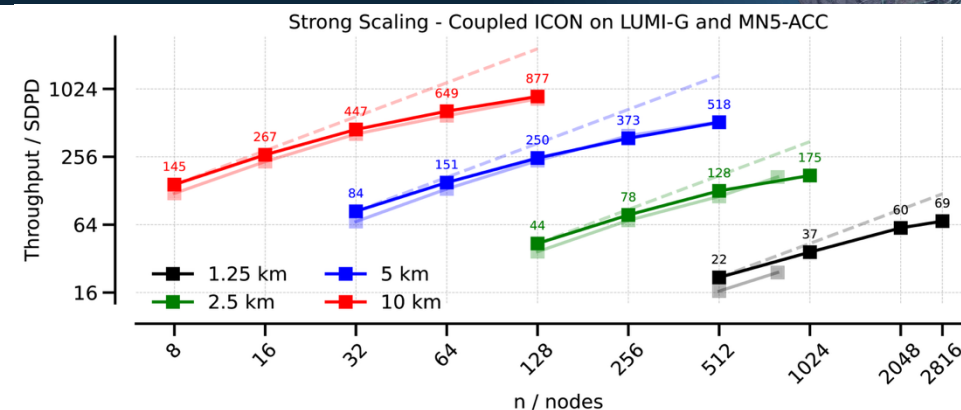
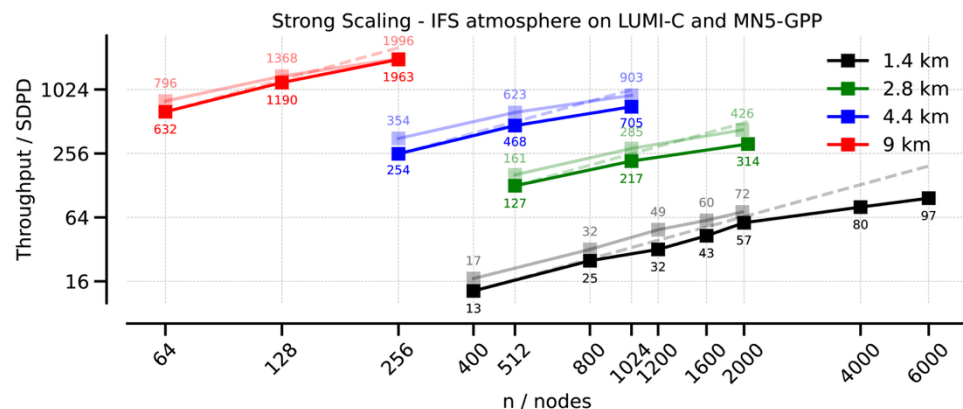
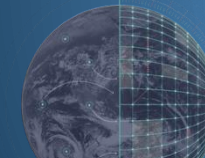


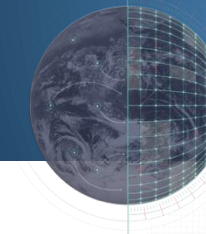
How Climate Change Affects Summer Temperatures in the USA

Results from high-resolution model simulations for a global warming of +1.4°C (approximate present-day level).





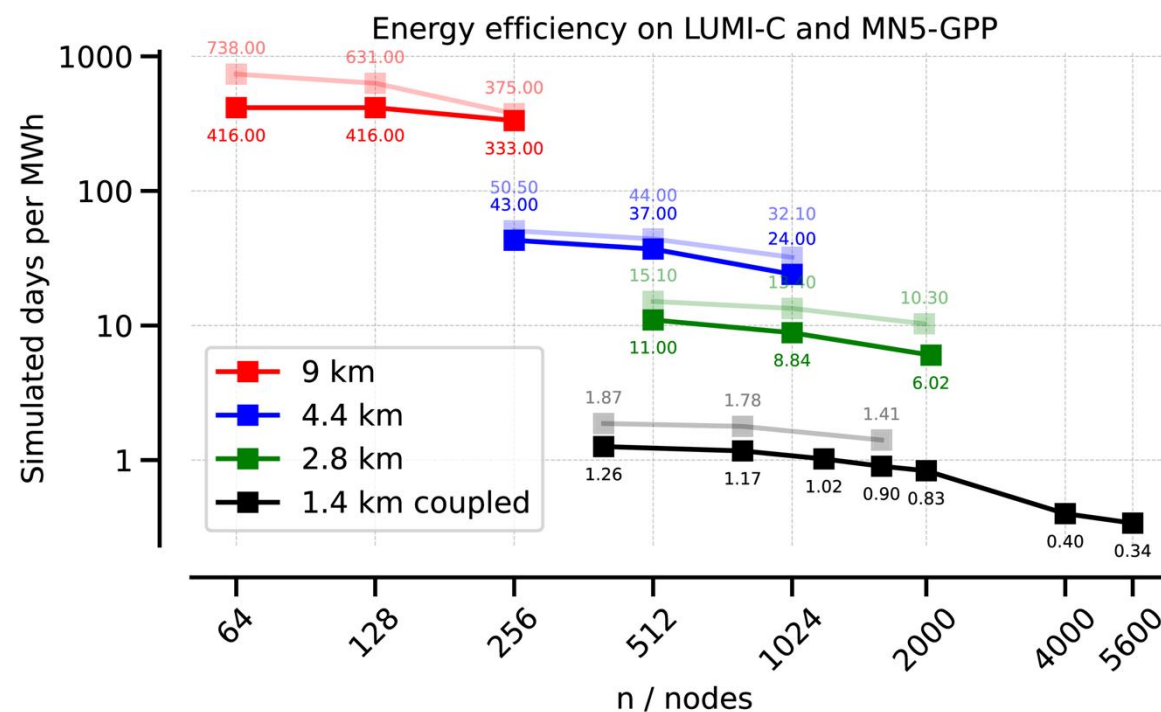


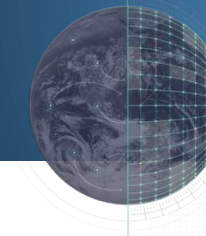


ENERGY EFFICIENCY

SDPD required on larger machines to match energy efficiency of 1km coupled run on 5600 nodes MN5:

- 237 SDPD on 5600 JUPITER nodes
- 134 SDPD on 5600 Frontier nodes
- 244 SDPD on 5600 El Capitan nodes





CONCLUSIONS

- First ever operational multi-decadal simulations at 5 km resolution
 - > 200 years of simulations already performed
 - Three leading and well-established Earth System Models
- Actionable information for different sectors by impact sector applications
- Efficient use of leading EuroHPC systems across diverse hardware architectures
 - Unprecedented performance and energy efficiency at up to 1km resolution
- A climate data portfolio exceeding 10PB and growing
 - Largest available treasure trove for training future climate emulators

