

DESTINATION EARTH: THE CLIMATE CHANGE ADAPTATION DIGITAL TWIN

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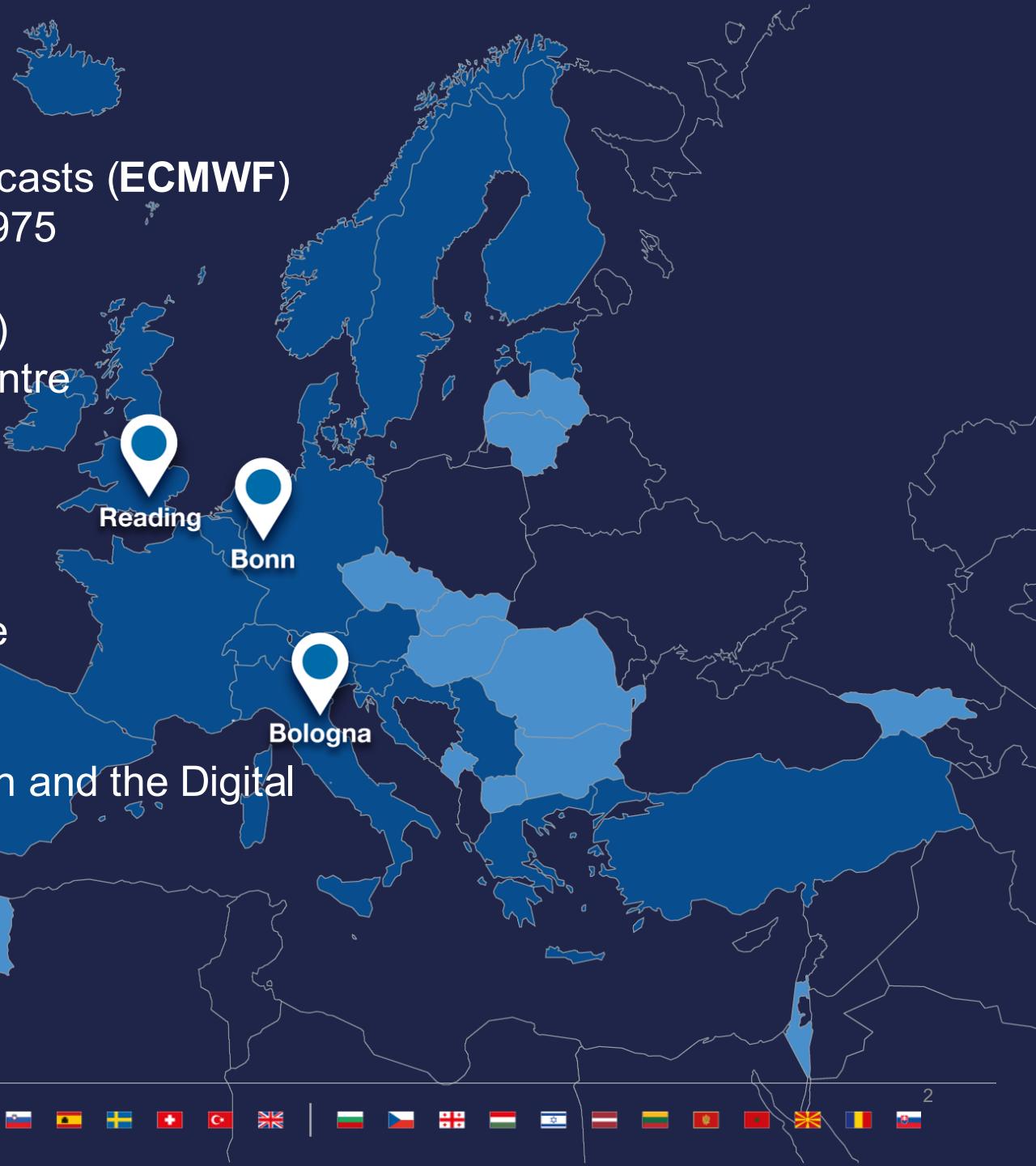
Who we are:

- 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.





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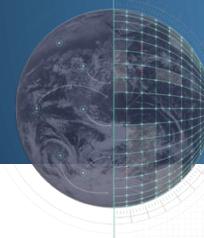
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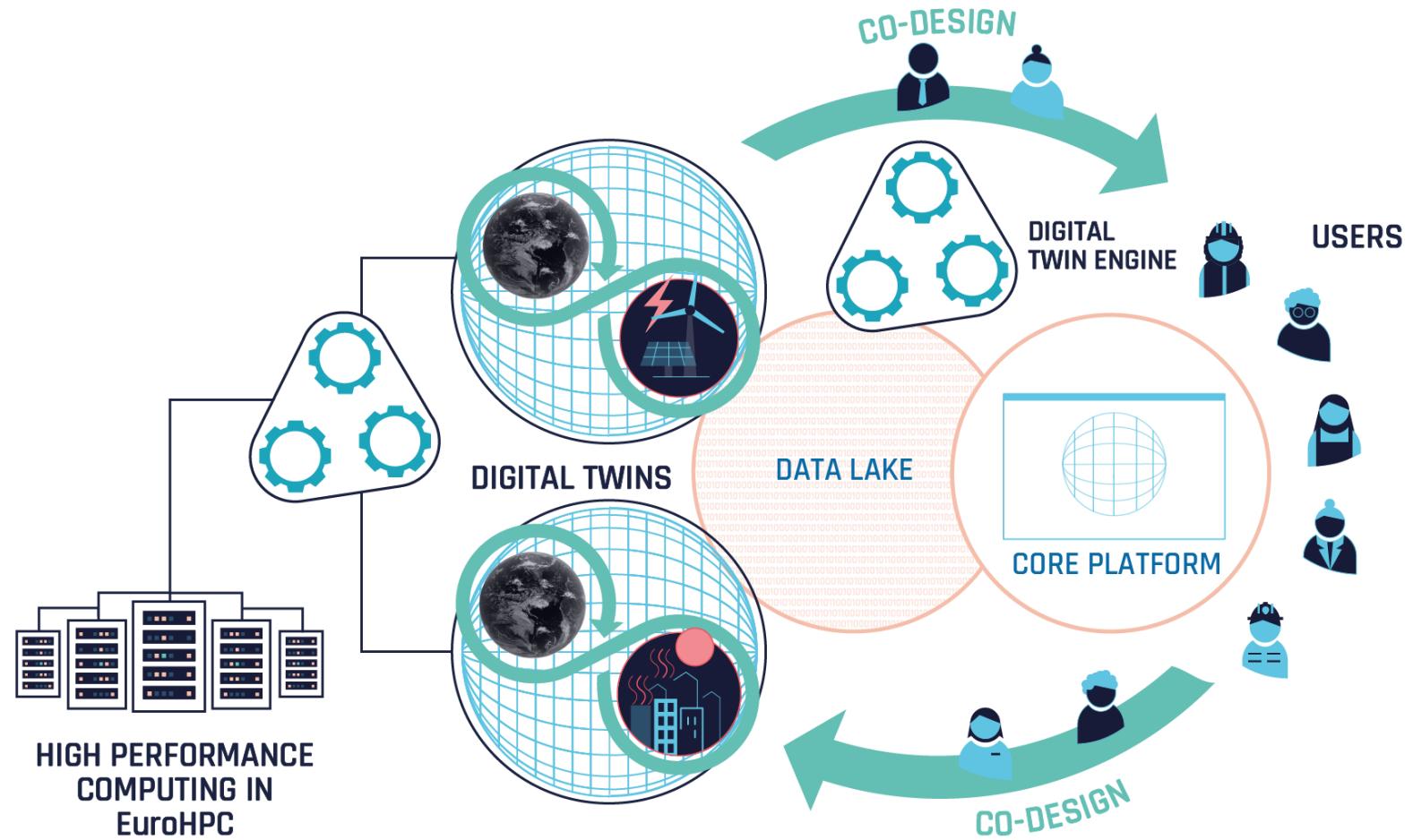
ECMWF

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EUMETSAT



A NOVEL INFORMATION SYSTEM





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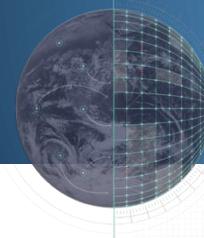
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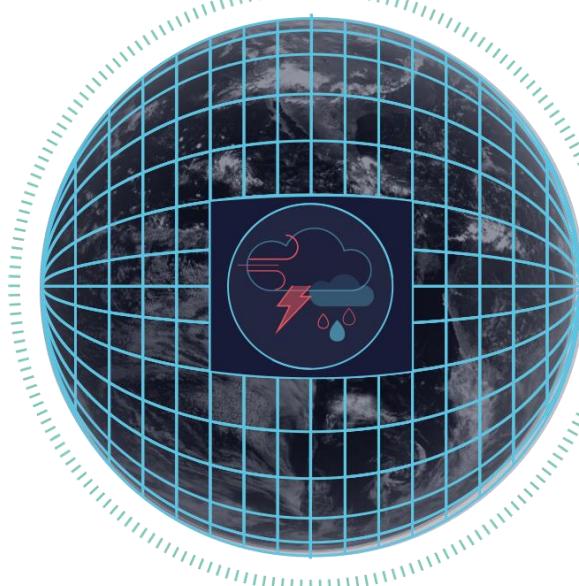
TWO HIGH PRIORITY DIGITAL TWINS

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



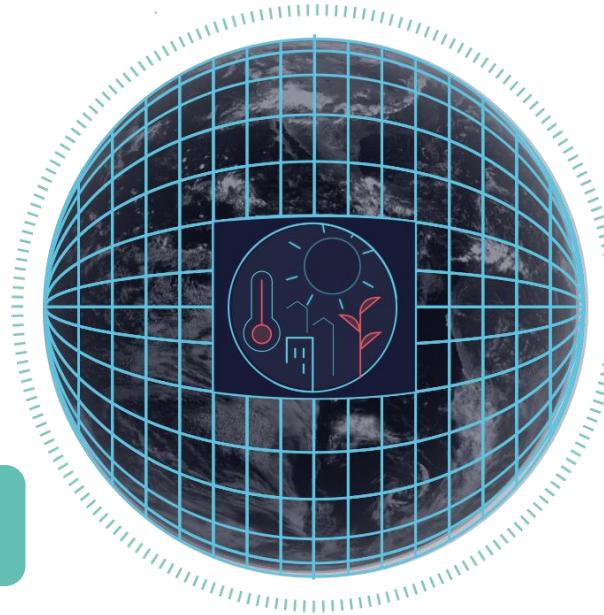
Run regularly &
on demand &
configurable

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



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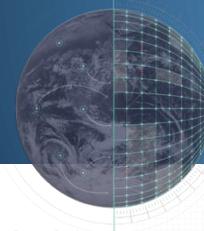
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THE CLIMATE CHANGE ADAPTATION DIGITAL TWIN

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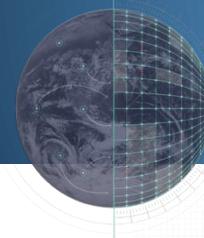
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ALFRED-WEGENER-INSTITUT
HELMHOLTZ-ZENTRUM FÜR POLAR-
UND MEERESFORSCHUNG



**Barcelona
Supercomputing
Center**
Centro Nacional de Supercomputación

Deutscher Wetterdienst
Wetter und Klima aus einer Hand



HELMHOLTZ



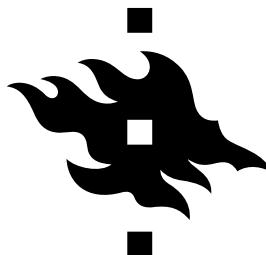
MAX-PLANCK-INSTITUT
FÜR METEOROLOGIE



 **Hewlett Packard
Enterprise**



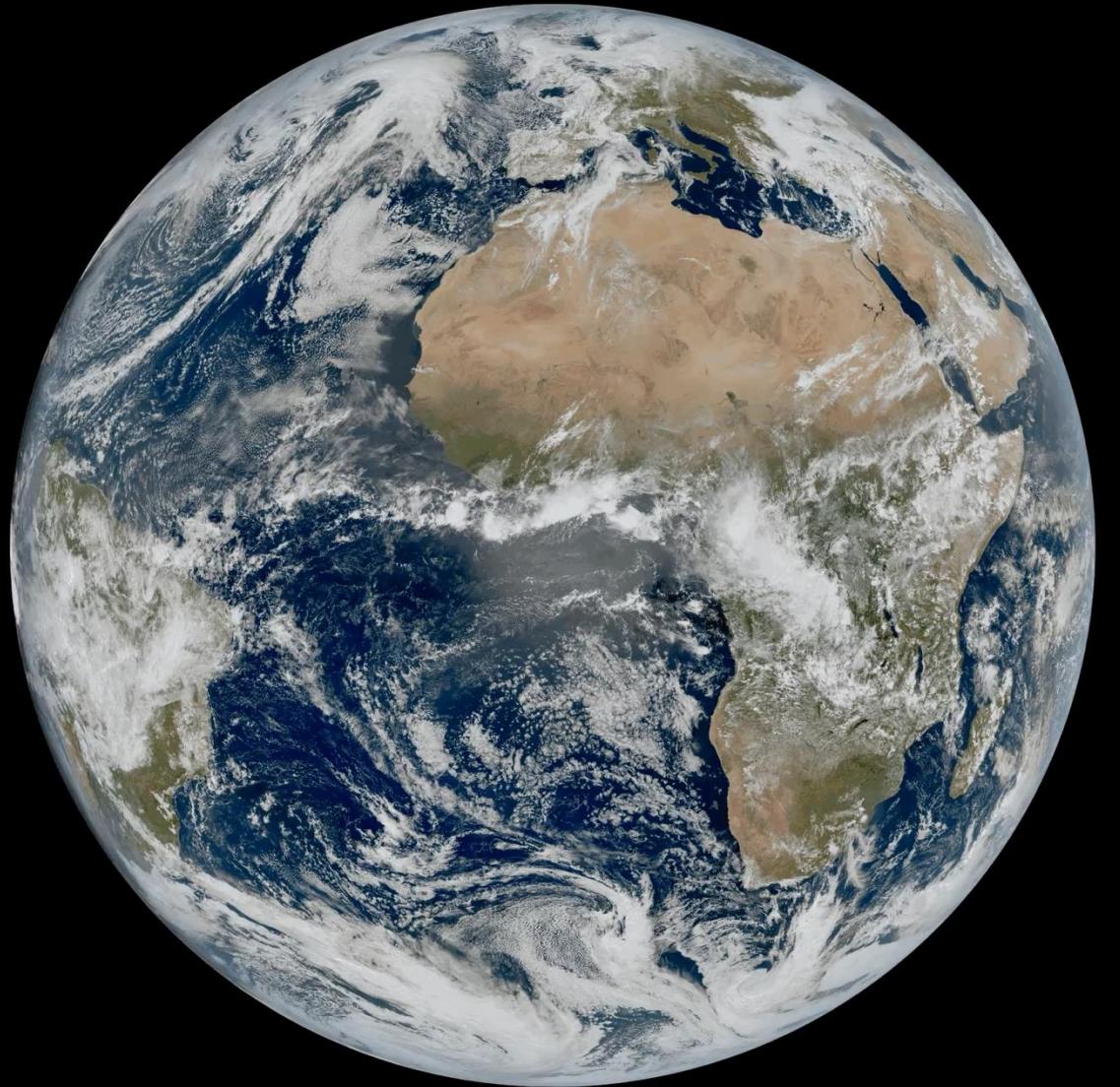
ILMATIETEEN LAITOS



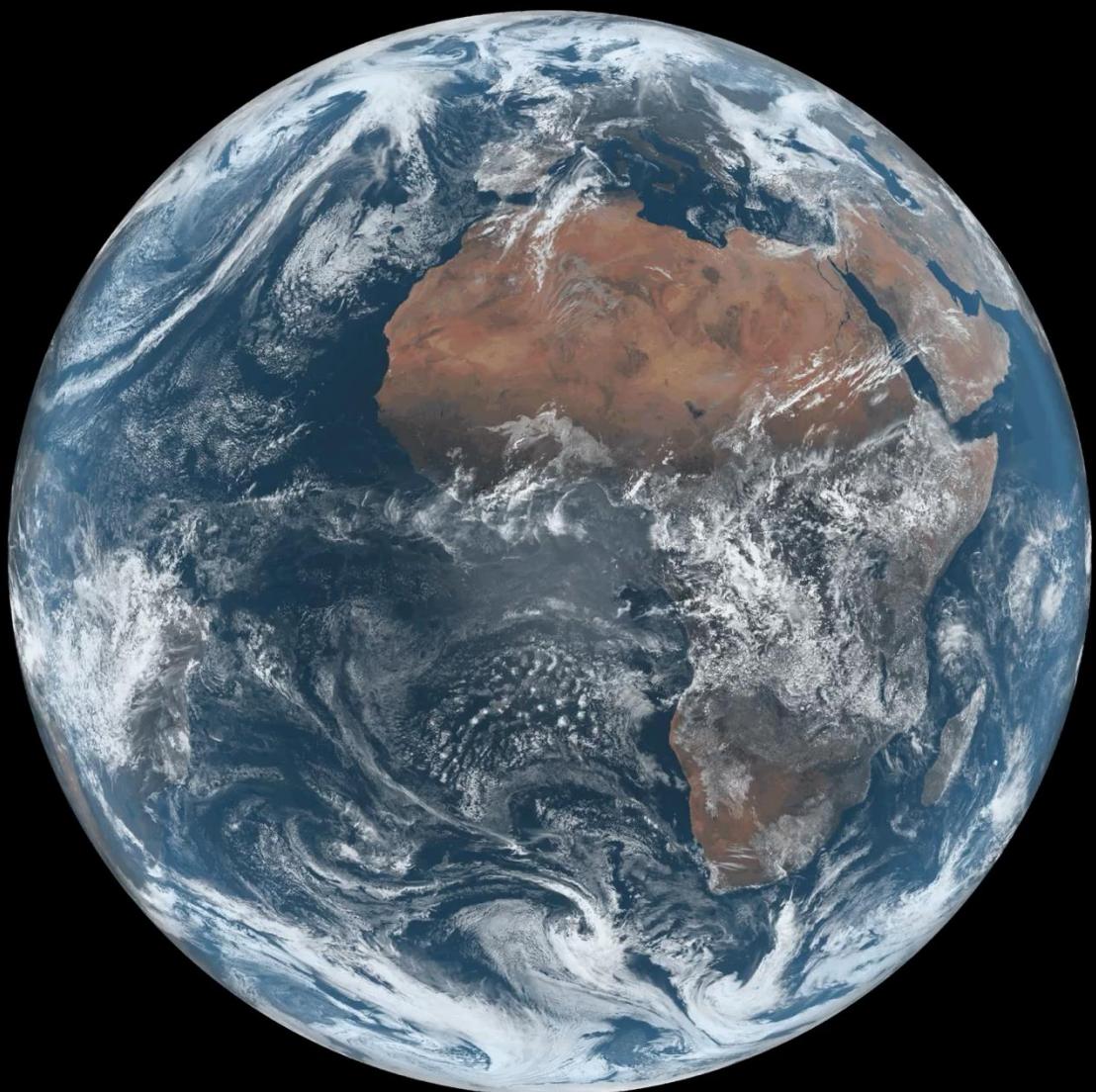
HELSINKIN YLIOPISTO
HELSINGFORS UNIVERSITET
UNIVERSITY OF HELSINKI



**Politecnico
di Torino**



MTG1 observations



ECMWF IFS 2.8km simulation

ICON

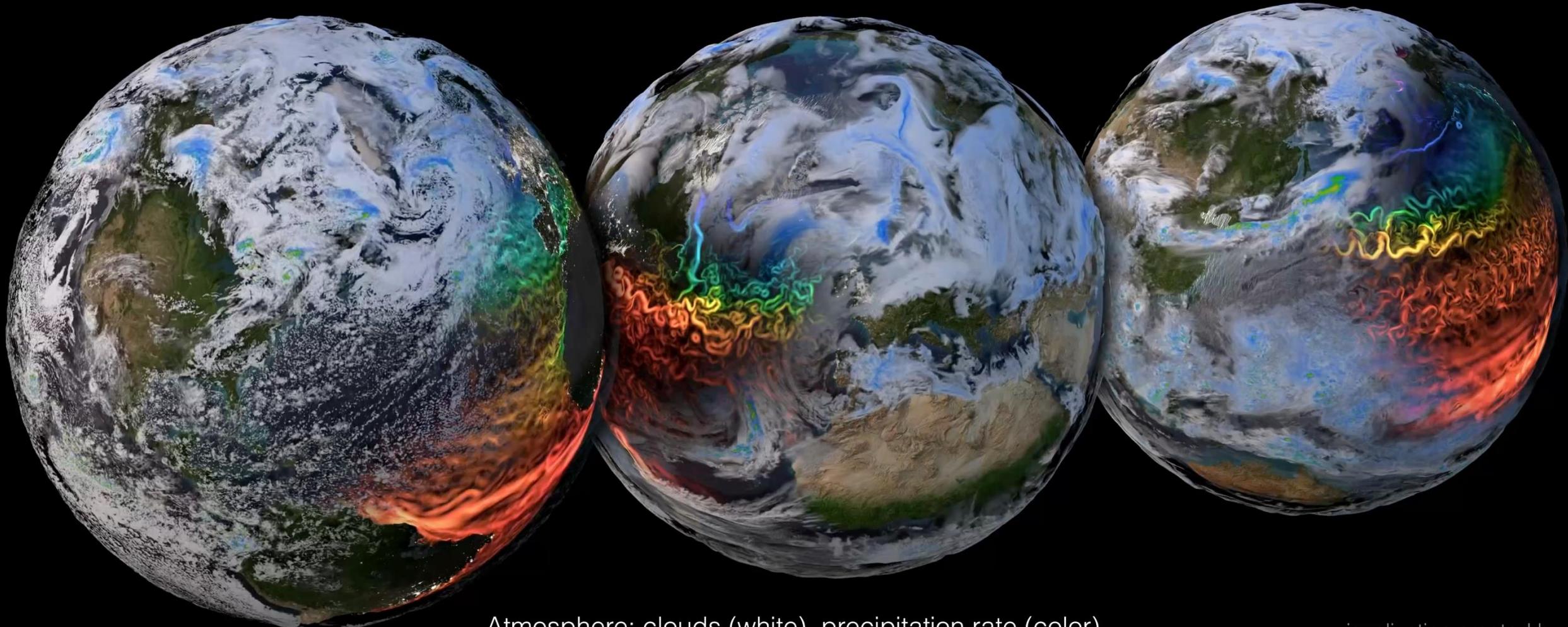
Aug 2039

IFS-FESOM

Jan 2039

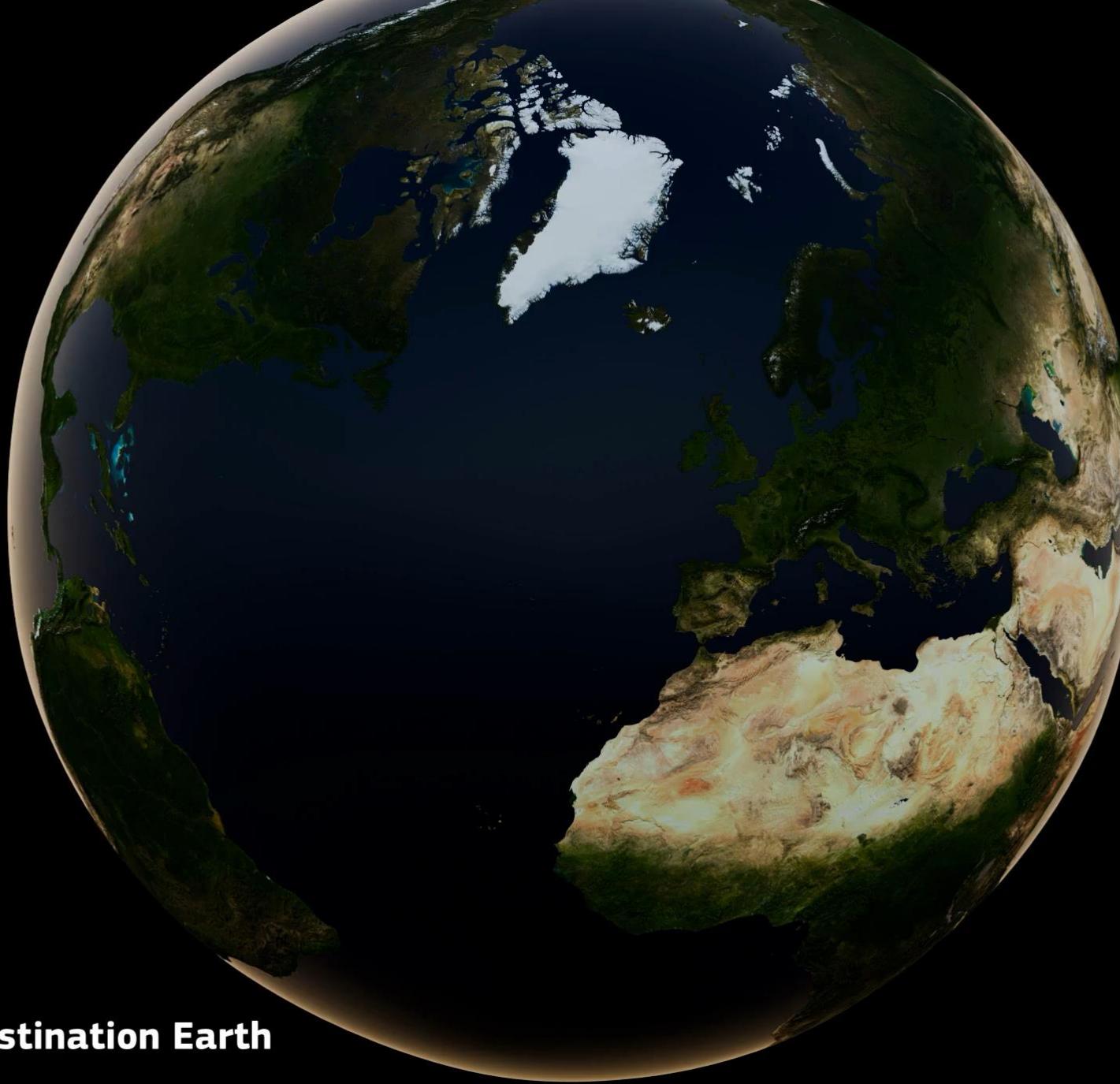
IFS-NEMO

Aug 2038



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

visualization created by
Andreas Müller (ECMWF)



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Destination Earth



EuroHPC
Joint Undertaking

LUMI



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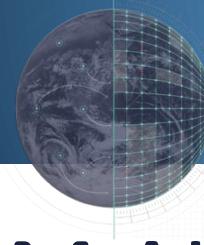
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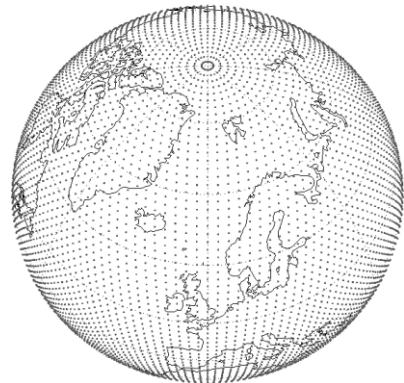
 ECMWF

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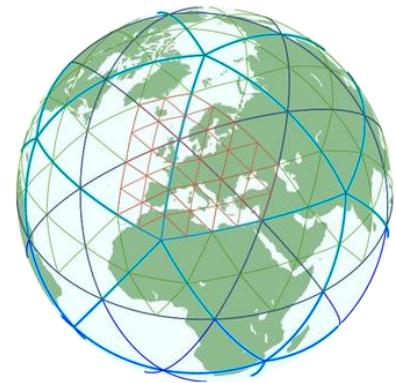
 EUMETSAT



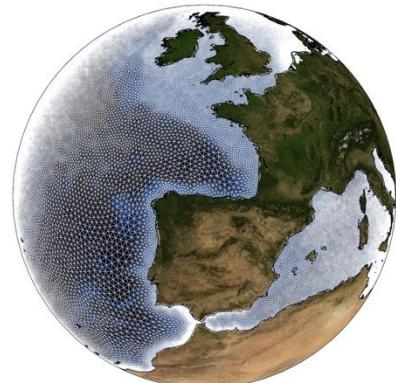
ONE GRID (AND PARAMETER SET) TO RULE THEM ALL



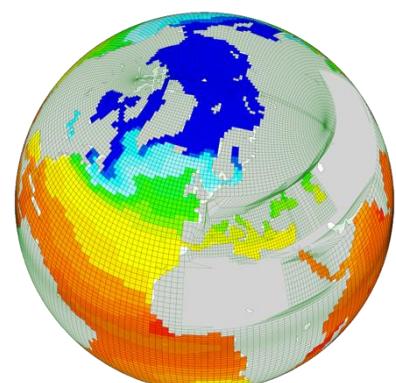
IFS Reduced Gaussian grid



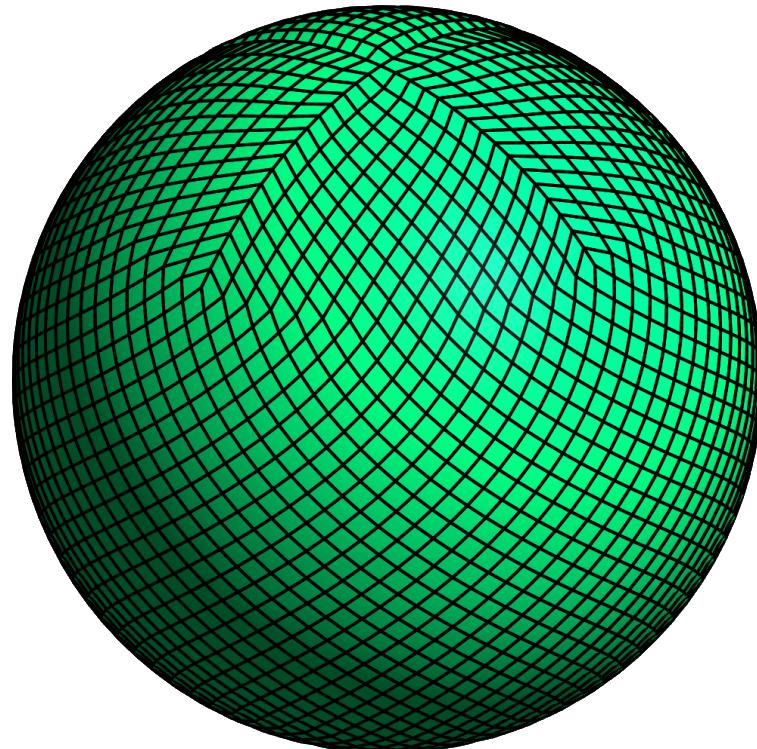
ICON icosahedral grid



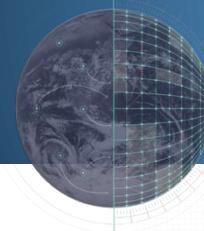
FESOM2 unstructured grid



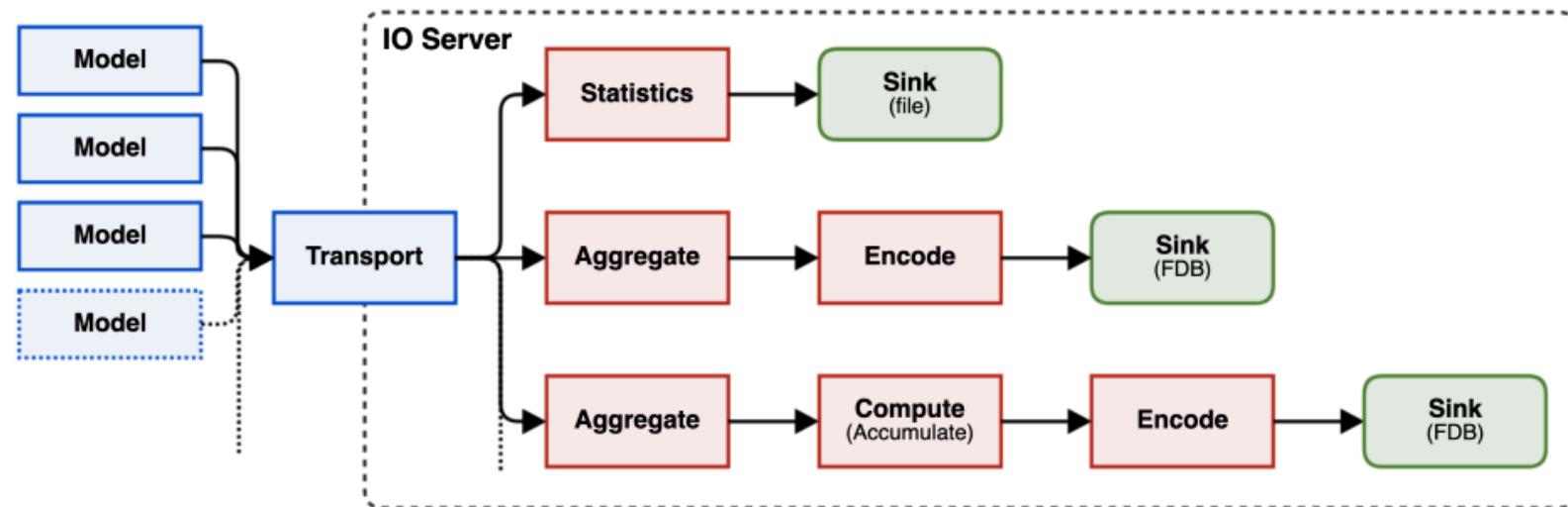
NEMO ORCA grid



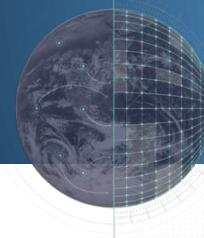
HEALPix grid



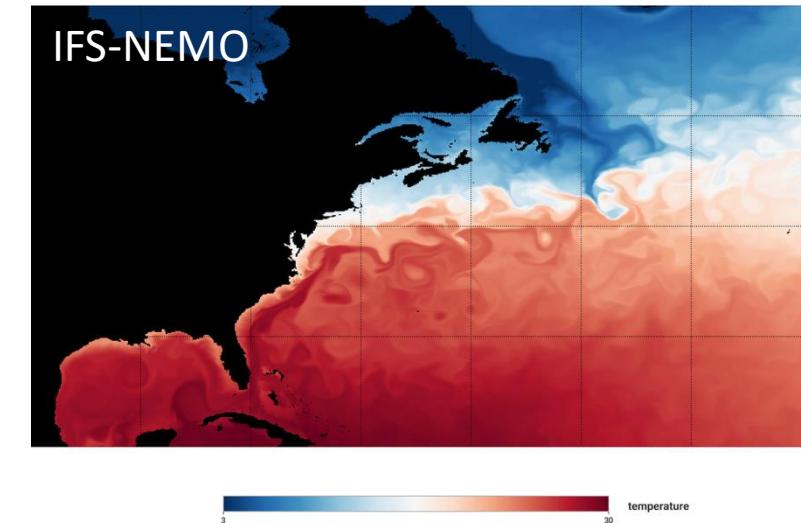
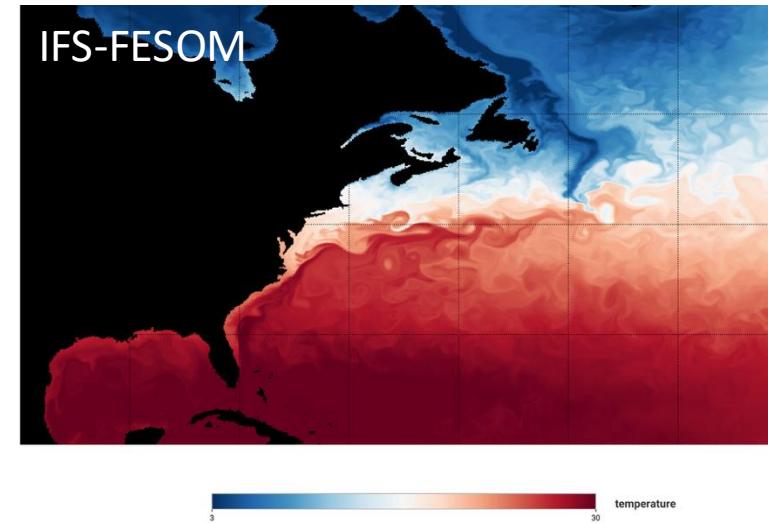
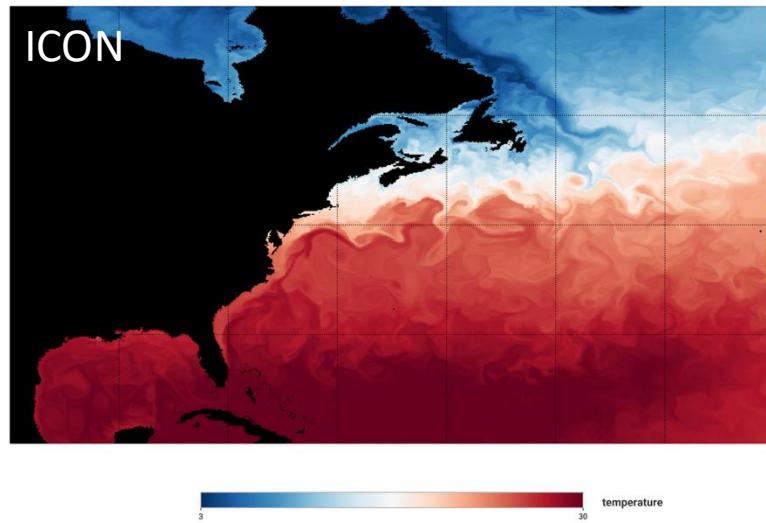
ON-THE-FLY I/O POST-PROCESSING AND STATISTICS



Sarmany et al. (2024), *MultiIO: 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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Terminal Shell Edit View Window Help



localhost

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

```
[1]: import xarray as xr
import numpy as np
#import gribcan
#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

[2]: #ICON
request = {
    "class": "d1",
    "dataset": "climate-dt",
    "activity": "scenariomip",
    "experiment": "ssp3-7.0",
    "realization": "1",
    "generation": "1",
    "model": "icon",
    "resolution": "high",
    "exper": "0001",
    "stream": "clt",
    "date": "20341031",
    "time": "0000",
    "type": "fc",
    "levelist": "2",
    "levtype": "03d",
    "param": "263501"
}

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

[3]: # Celsius

```
[3]: dnpodata[0].values-273
```

demo - wedi1@jpbl-s01-03:~ - zsh - 121x11

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

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



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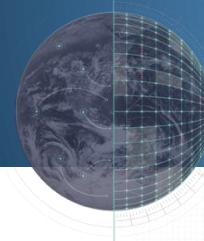
 EUMETSAT



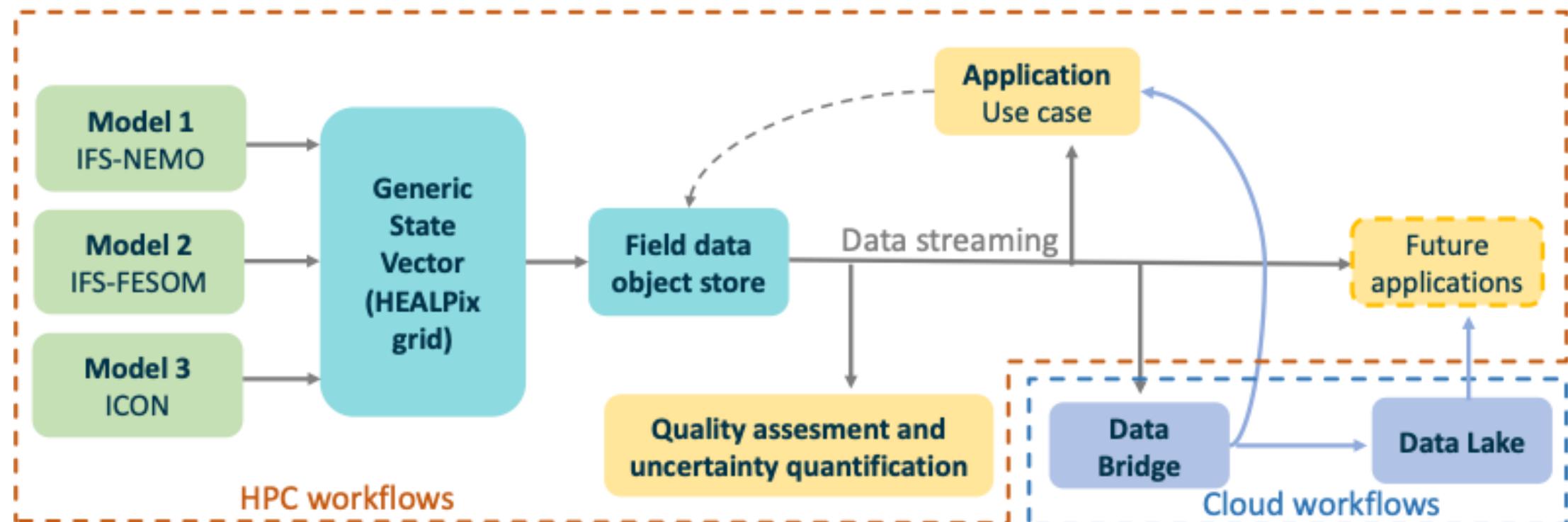
CLIMATE DT SIMULATIONS

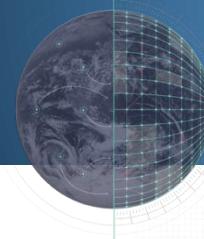
- **Control (10-15 years)**
 - 1990 forcing with no change in forcing over time to quantify model drift and simulated inter-annual variability
 - Provide relevant context for interpreting historical and scenario simulations
- **Historical (20-30 years)**
 - Starting in 1990, the forcing follows observed 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	 100%
Future projection	IFS-NEMO	4.4	8.3	2020-2039	LUMI-C	215	840	 100%
Future projection	IFS-FESOM	4.4	5	2020-2039	MN5-GPP	284	840	 100%
Historical simulation	ICON	10	5	1990-2019	LUMI-G	106	315	 100%
Historical simulation	IFS-NEMO	9	8.3	1990-2001	LUMI-C	256	126	 100%
Storyline simulation (past)	IFS-FESOM	9	5	2017-2024	LUMI-C	201	84	 100%
Storyline simulation (present)	IFS-FESOM	9	5	2017-2024	LUMI-C	201	84	 100%
Storyline simulation (future)	IFS-FESOM	9	5	2017-2024	LUMI-C	201	84	 100%
Control simulation	IFS-NEMO	9	8.3	15 years	LUMI-C	256	262	 100%
Control simulation	IFS-FESOM	9	5	17 years	MN5-GPP	284	157	 100%
Phase 2								
Historical simulation	IFS-NEMO	4.4	8.3	1990-2014	MN5-GPP	260	1051	 100%
Historical simulation	IFS-FESOM	4.4	5	1990-2014	LUMI-C	279	1051	 100%
Historical simulation	ICON	5	5	1990-2014	LUMI-G	106	315	 100%
Control simulation	ICON	5	5	10 years	LUMI-G	128	438	 100%
Control simulation	IFS-FESOM	4.4	5	10 years	LUMI-C	279	438	 100%
Control simulation	IFS-NEMO	4.4	8.3	15 years	MN5-GPP	248	262	 100%
Future projection	IFS-NEMO	4.4	8.3	2015-2049	MN5-GPP	260	1260	 57%
Future projection	IFS-FESOM	4.4	5	2015-2049	LUMI-C	279	1260	 60%
Future projection	ICON	5	5	2015-2049	LUMI-G	128	1008	 7%

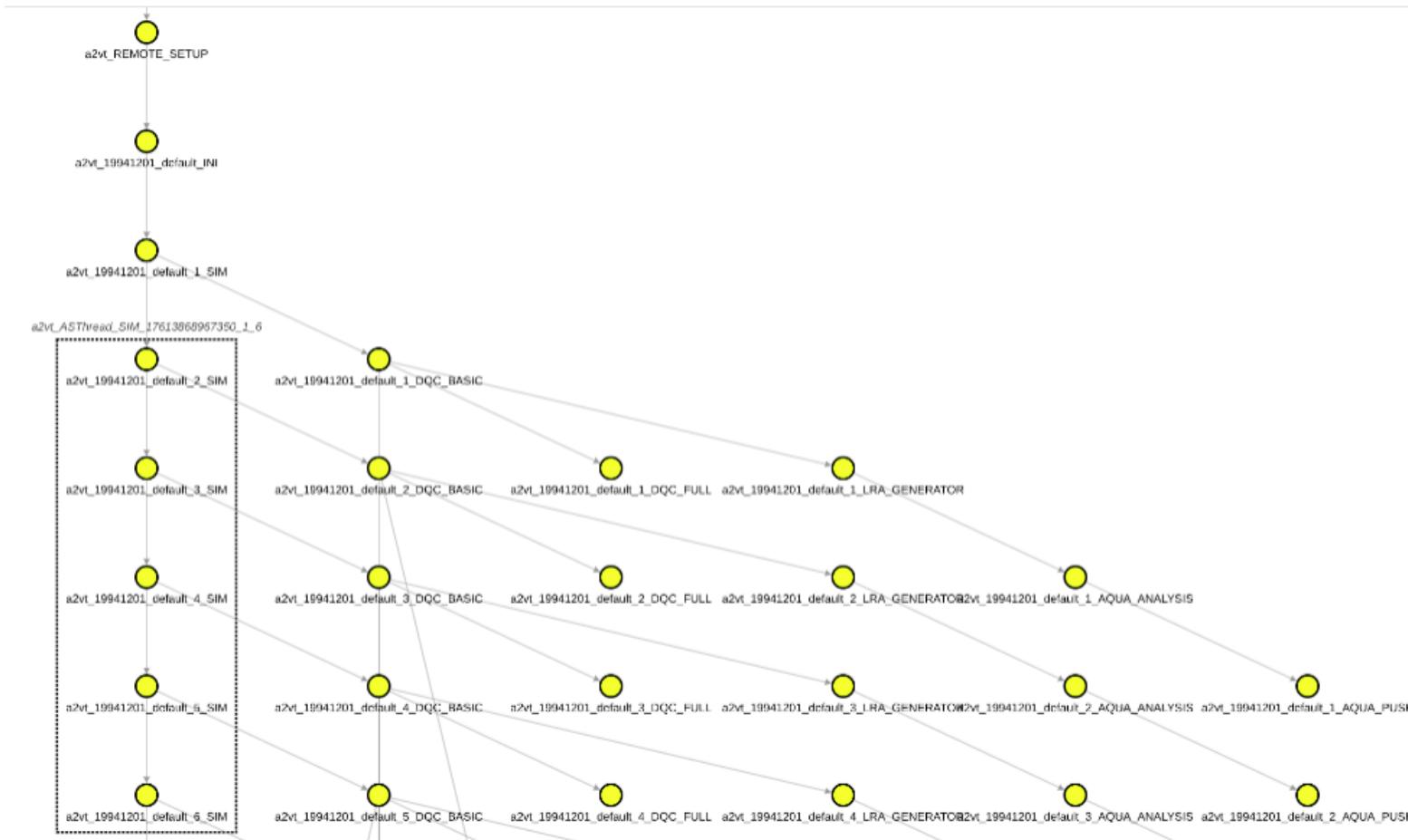


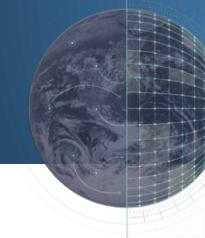
CLIMATE DT WORKFLOWS



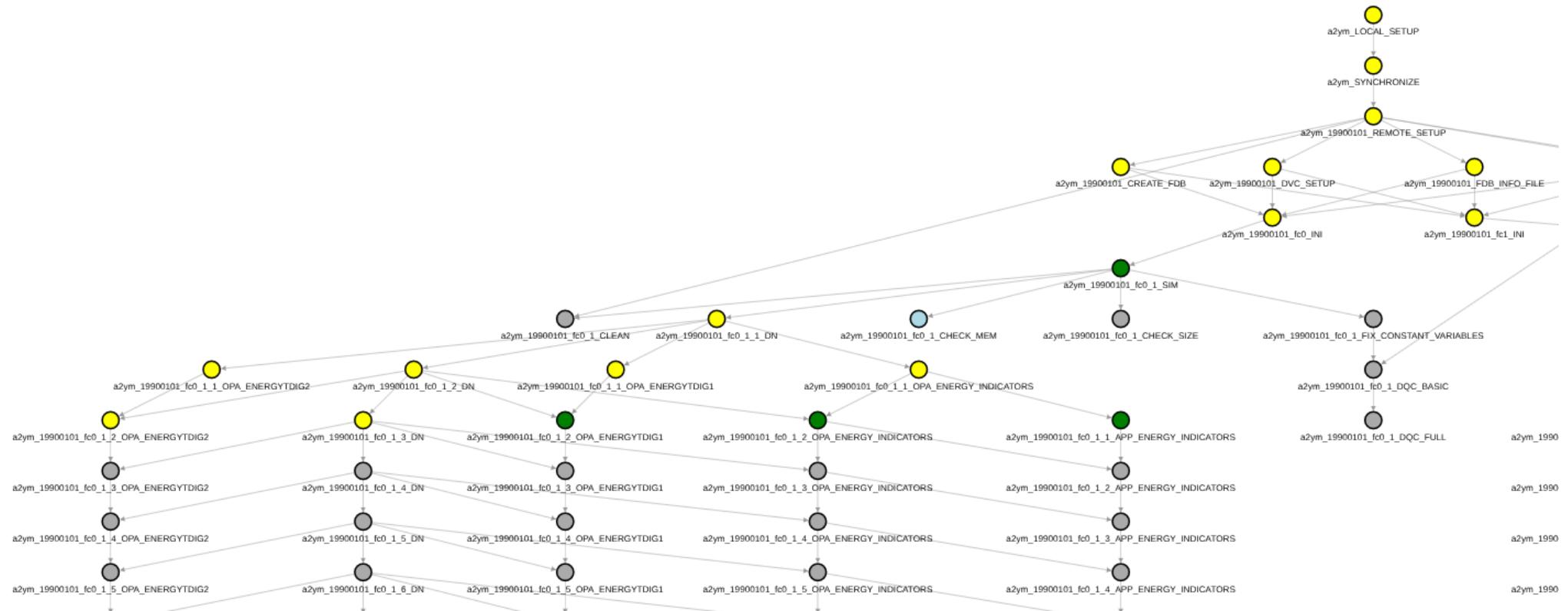


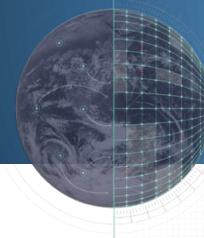
CLIMATE DT WORKFLOWS





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

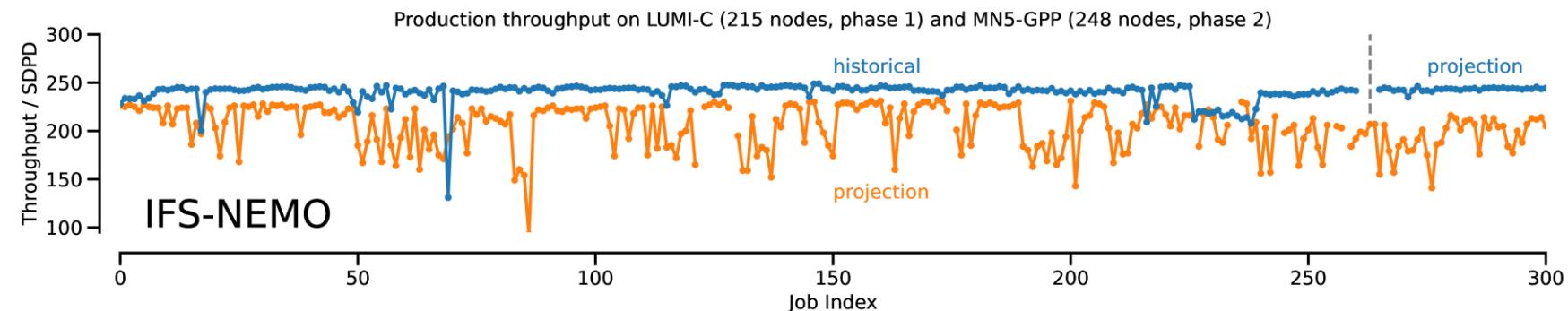
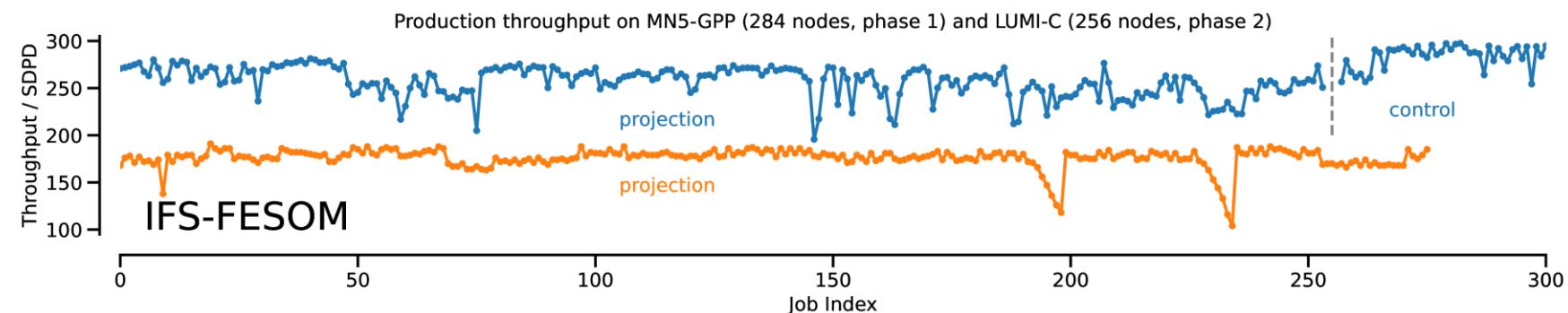
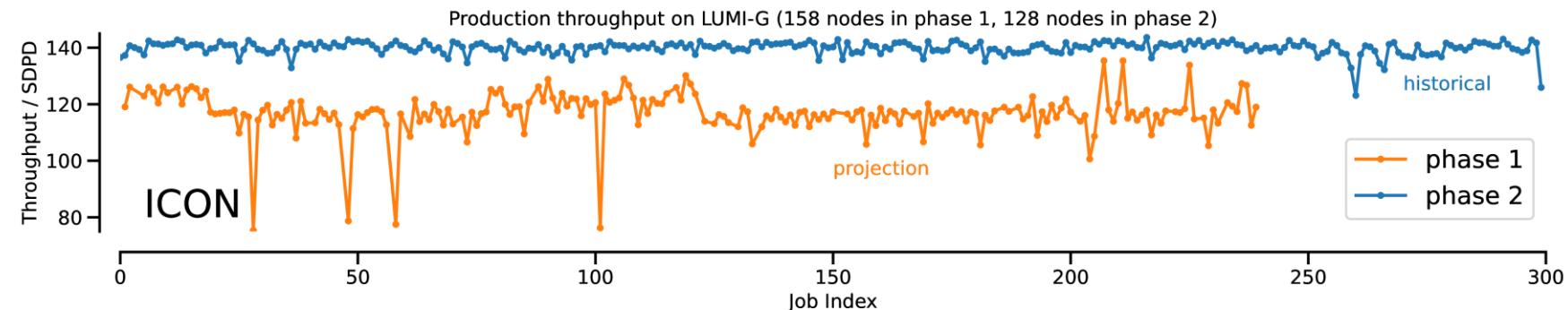
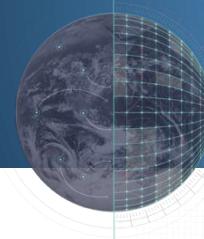
- NDR Infiniband
- GPU partition (MN5-ACC)
 - 1120 nodes with 4 NVIDIA H100 GPUs
- CPU partition (MN5-GPP)
 - 6480 nodes with 2 56-core Intel Sapphire Rapids 8480+ CPUs



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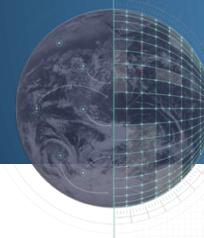
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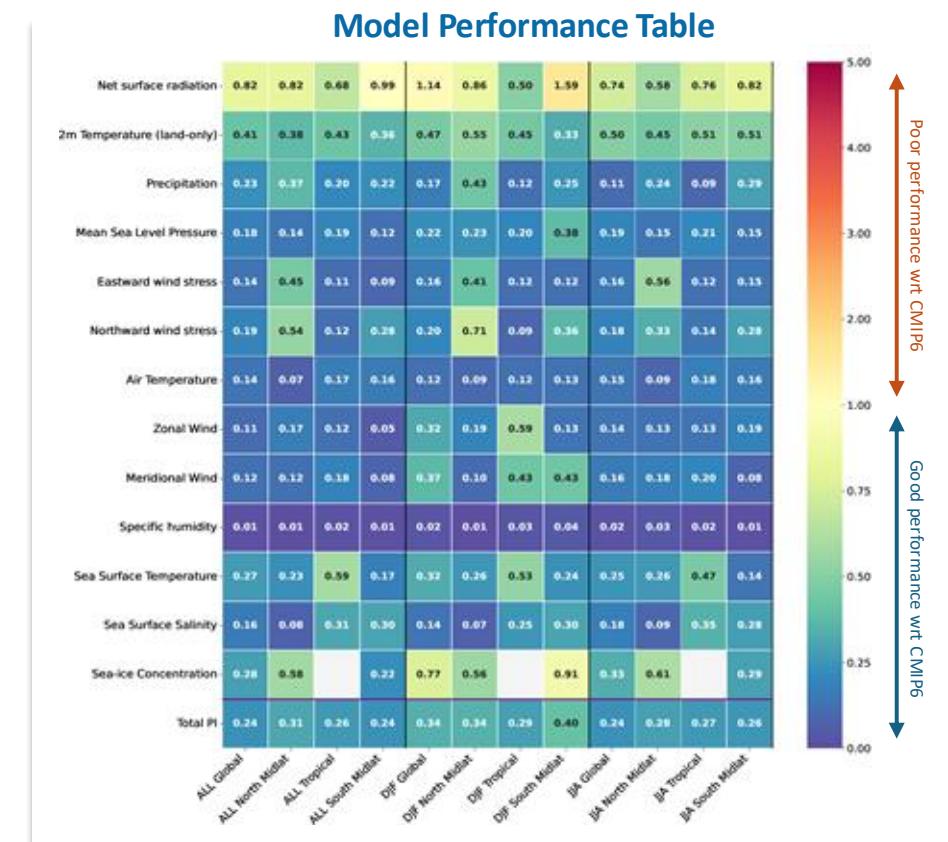
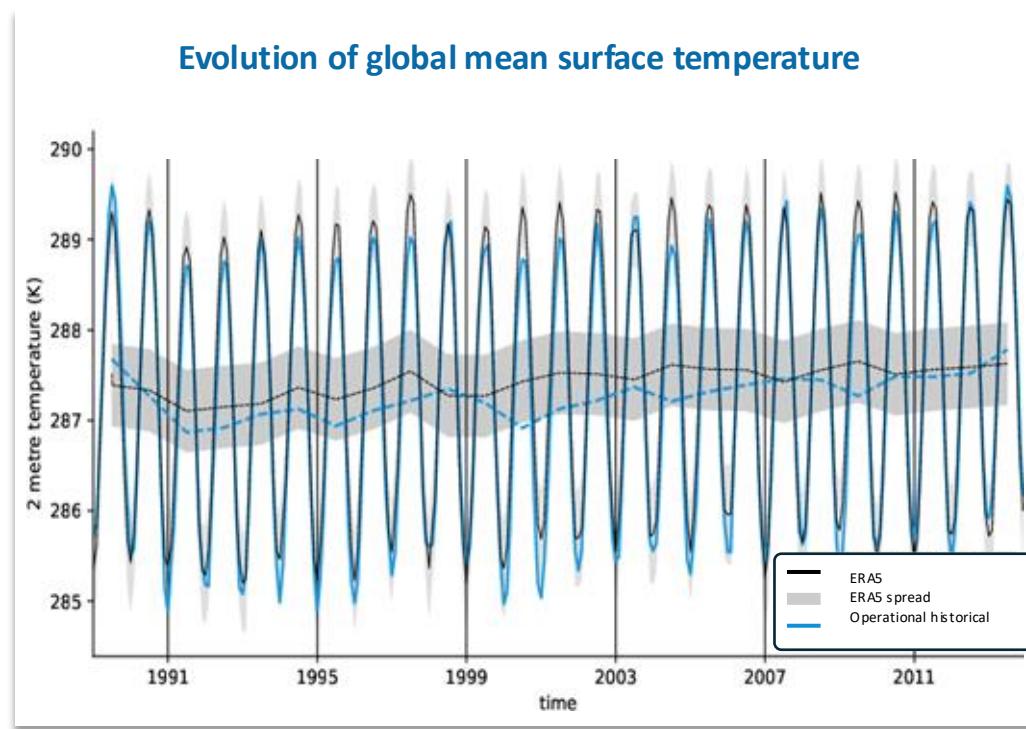
ECMWF

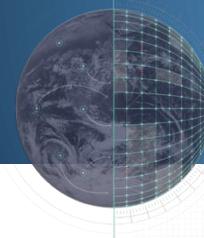
esa

EUMETSAT



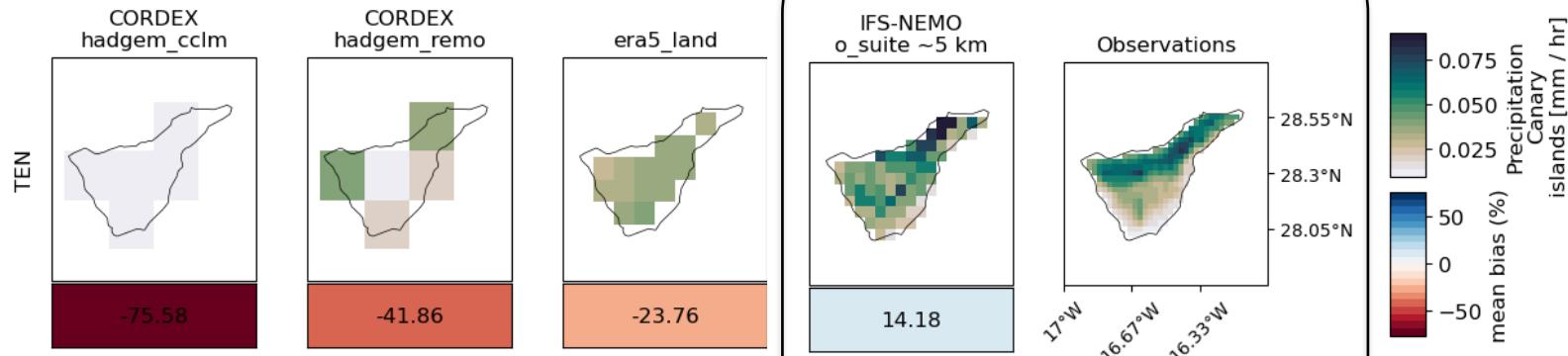
AQUA: REAL TIME MODEL EVALUATION



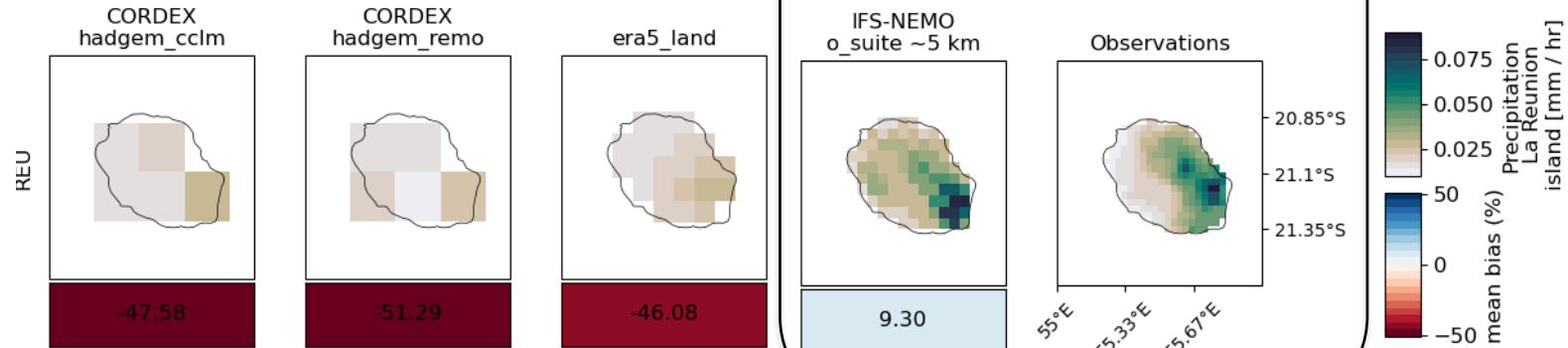


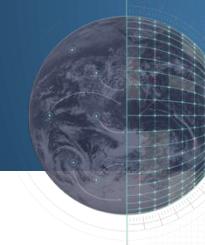
MODEL EVALUATION AGAINST OBSERVATIONS

Tenerife, the Canary Islands

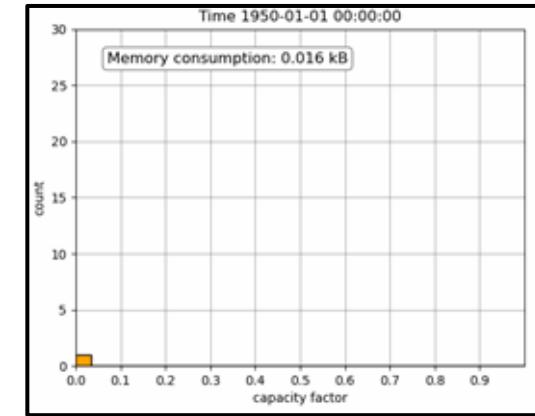
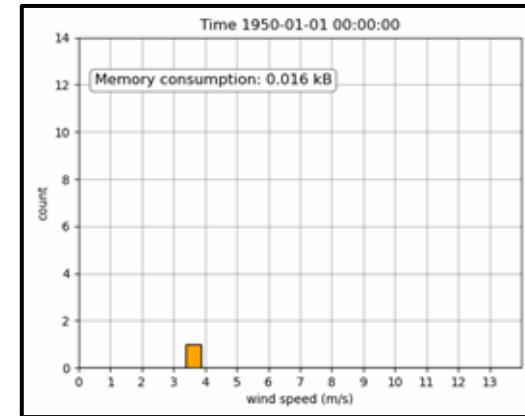
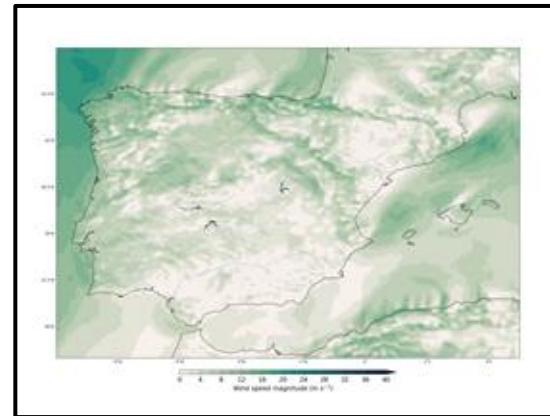
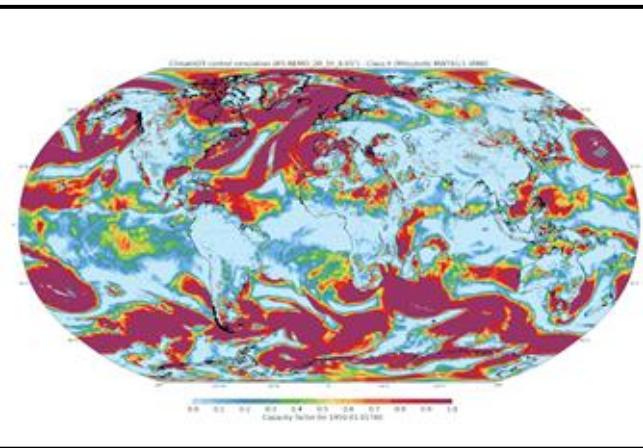
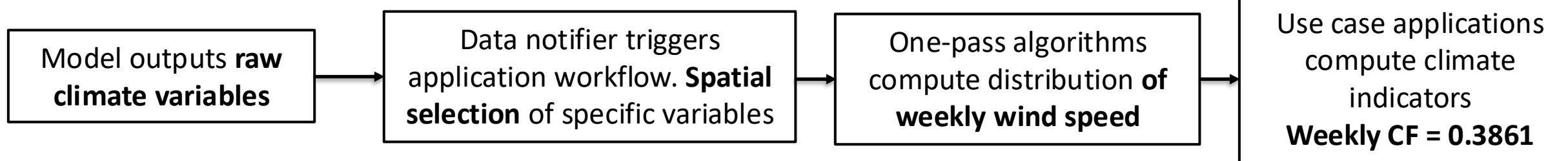


Reunion, the Mascarene Islands



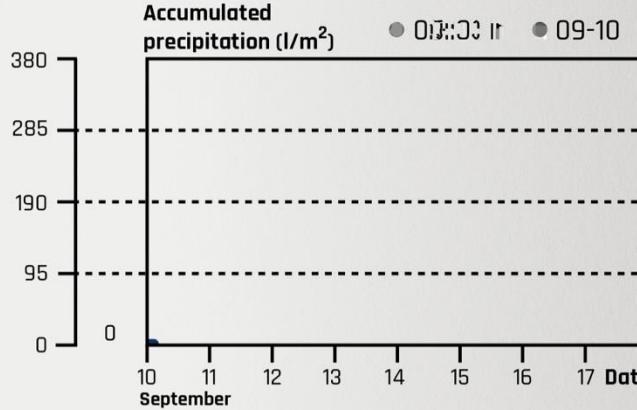


ONE-PASS ALGORITHMS (OPA)

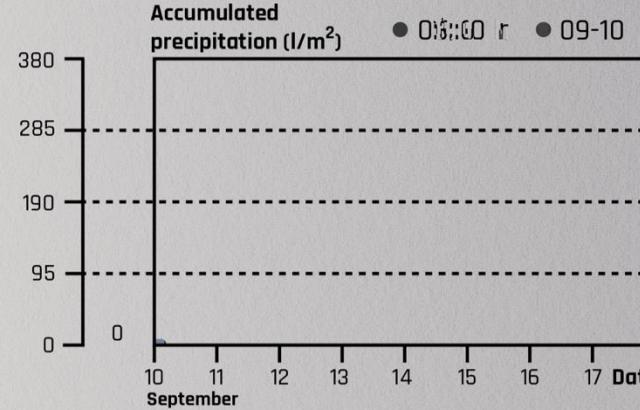




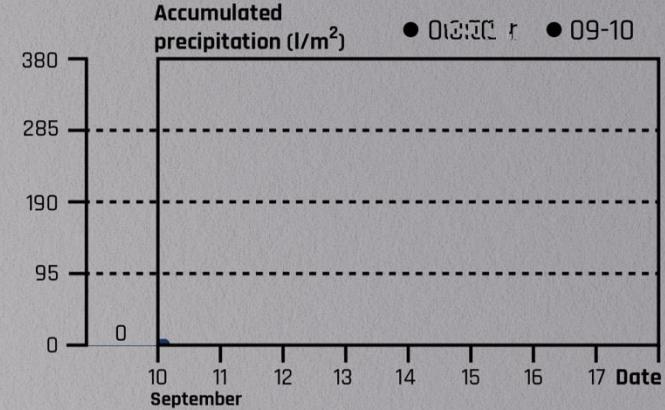
Climate **Past (1950)**



Climate **Present (+1.2°C)**



Climate **Future (+2°C)**





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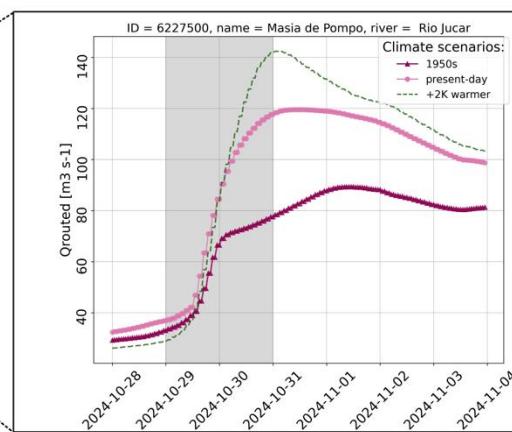
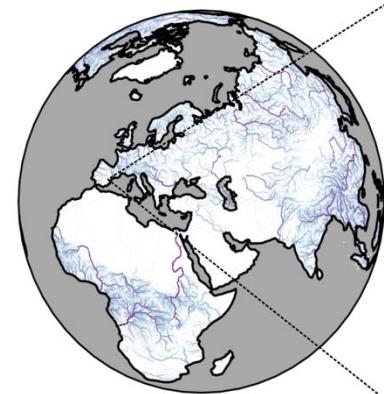
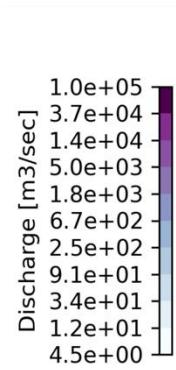
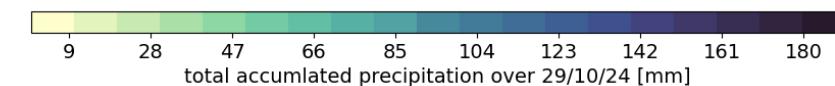
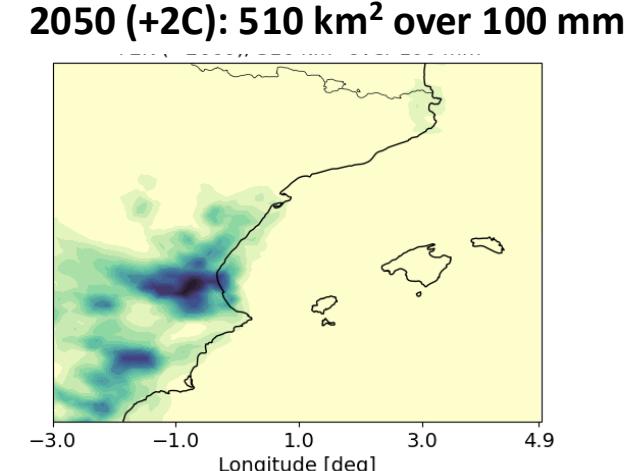
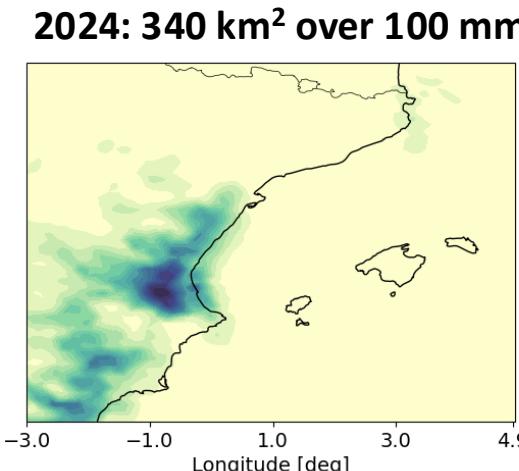
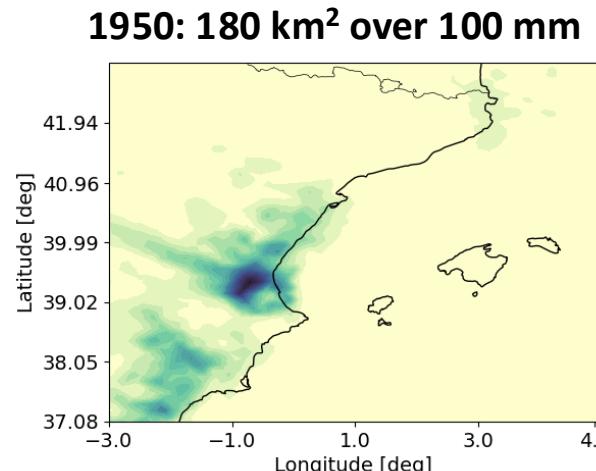
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REPLAYING THE 2024 VALENCIA FLOODS



How Climate Change Affects Summer Temperatures in the USA

Results from high-resolution model simulations for a global warming of $+1.4^{\circ}\text{C}$ (approximate present-day level).

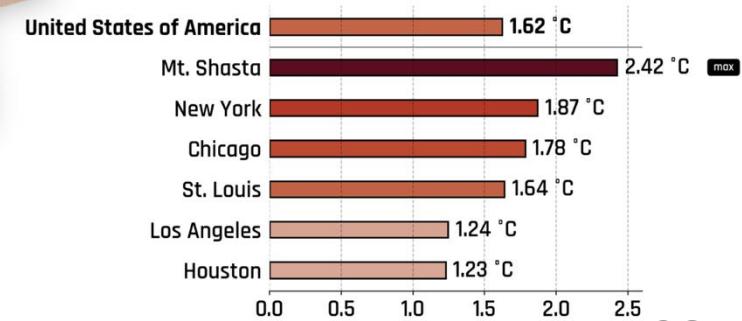
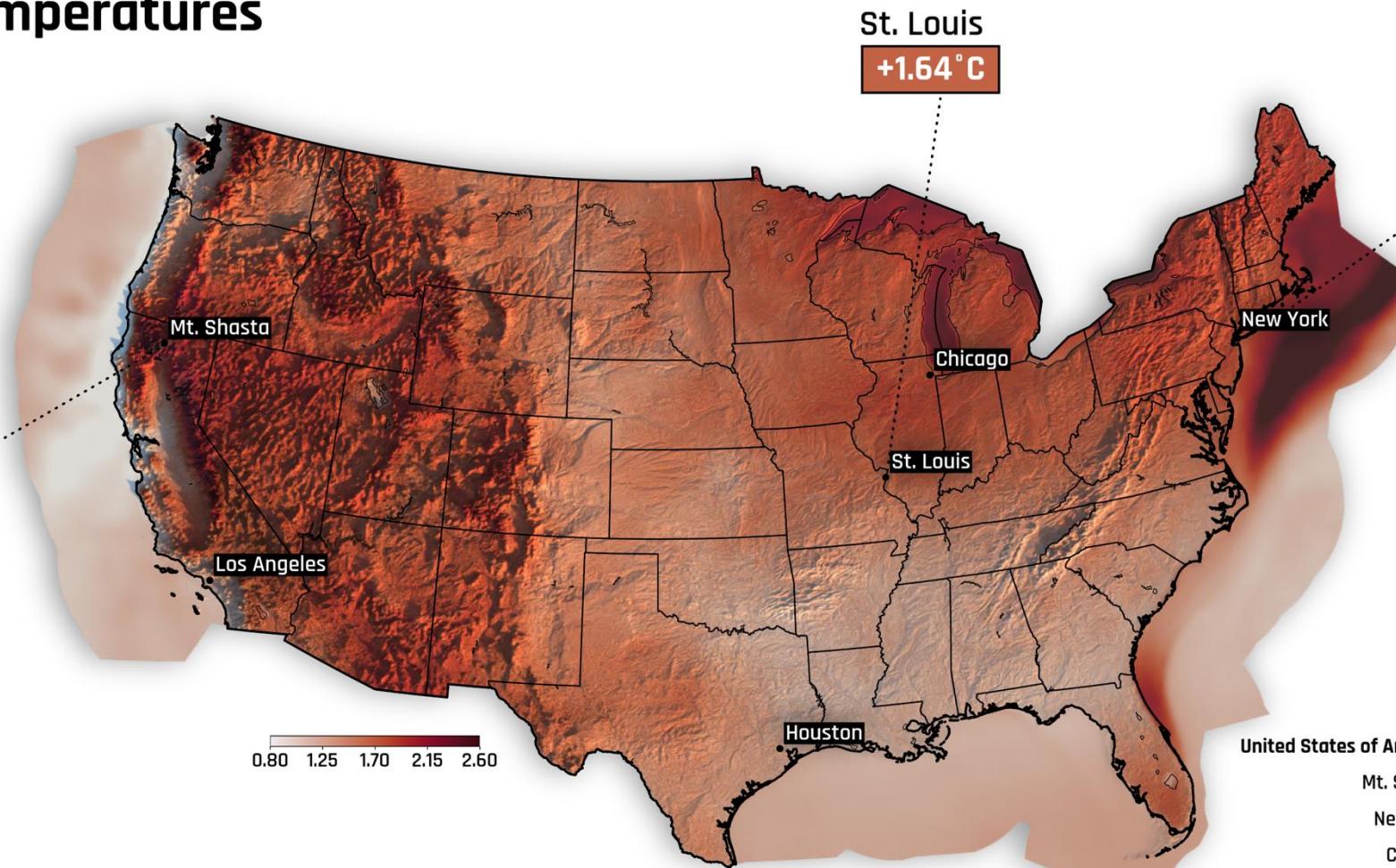
Mt. Shasta
 $+2.42^{\circ}\text{C}$

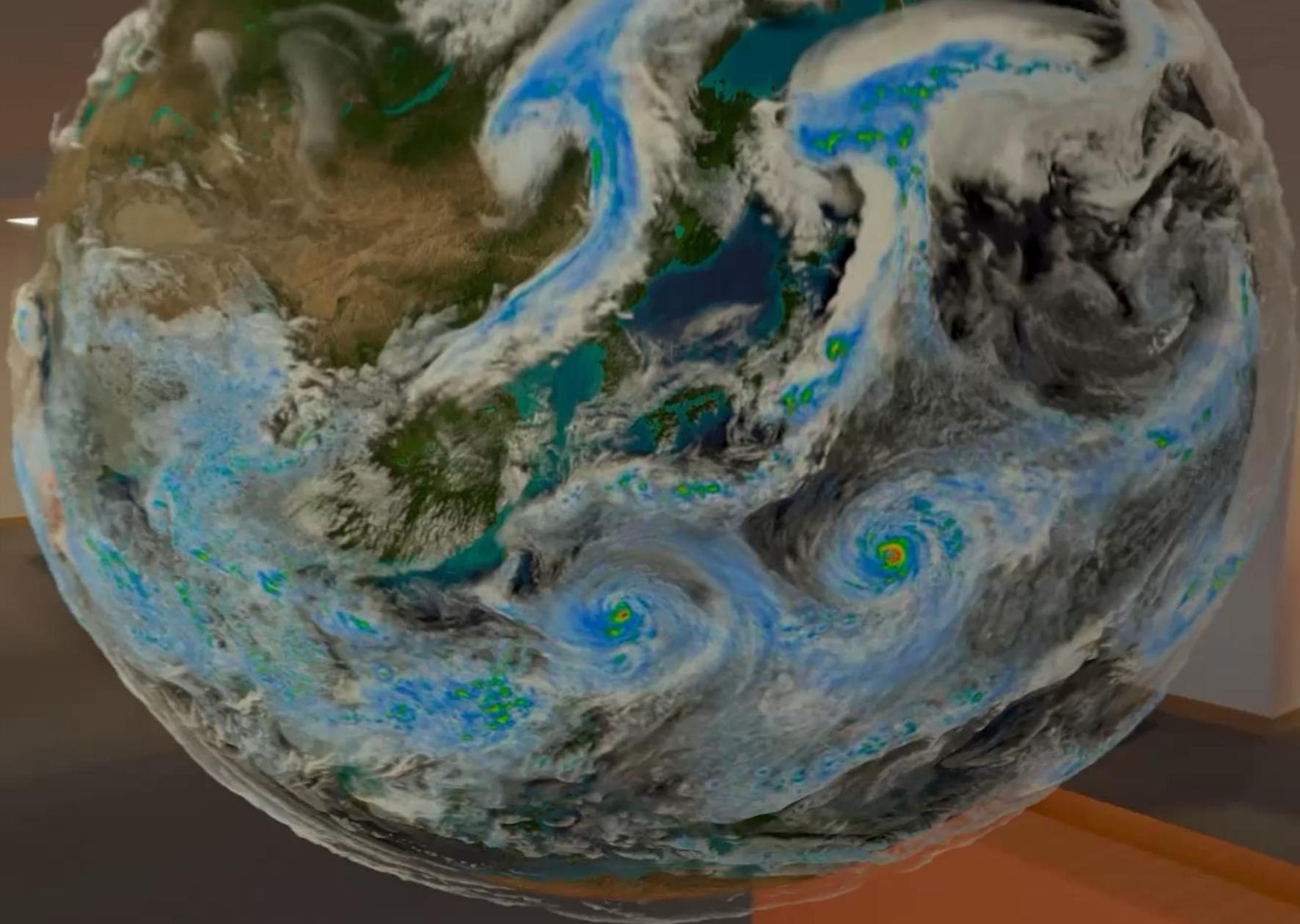
St. Louis

$+1.64^{\circ}\text{C}$

New York

$+1.87^{\circ}\text{C}$





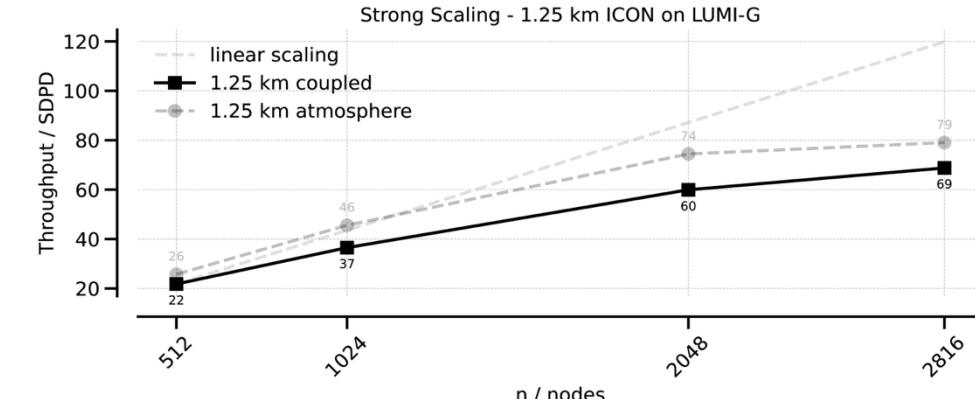
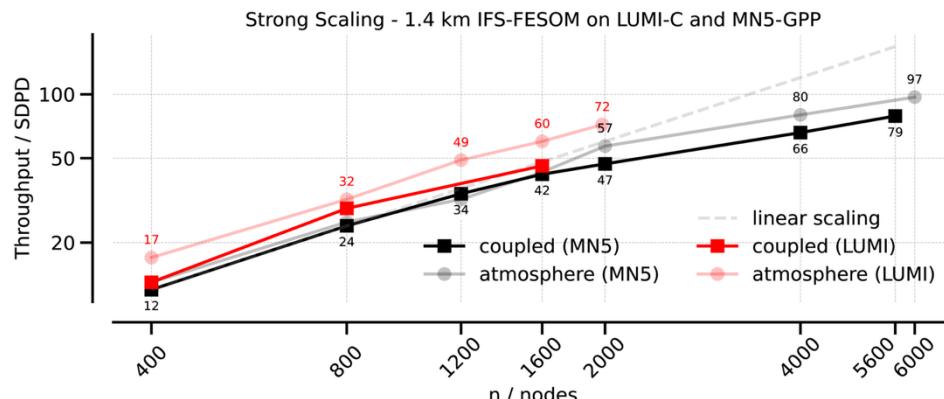
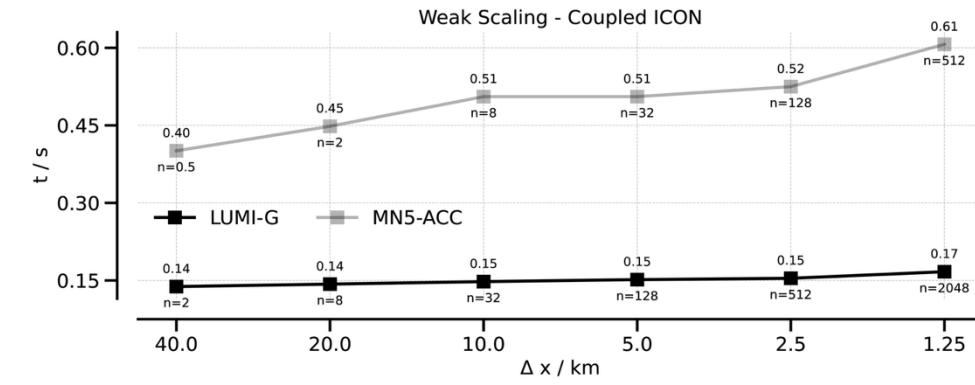
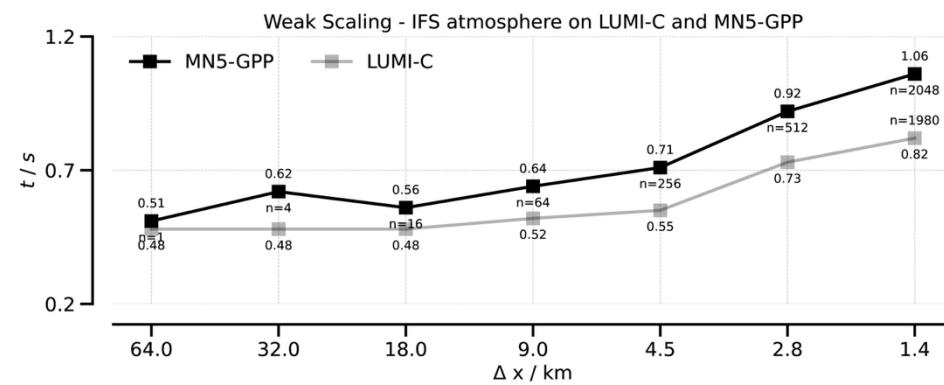
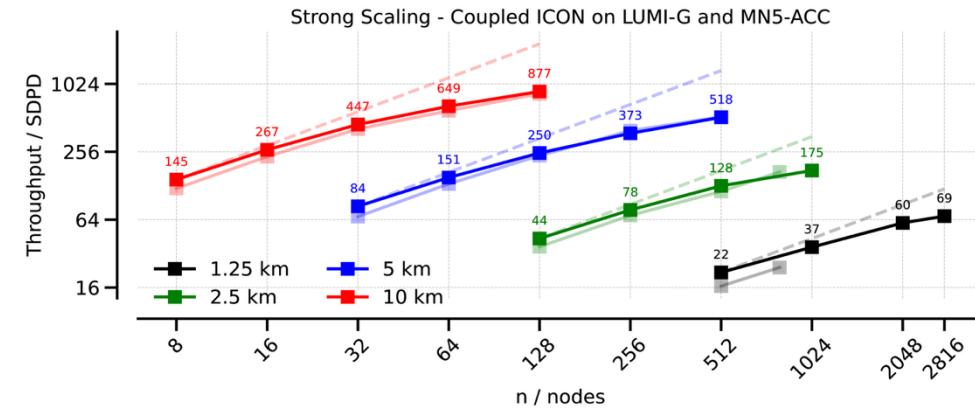
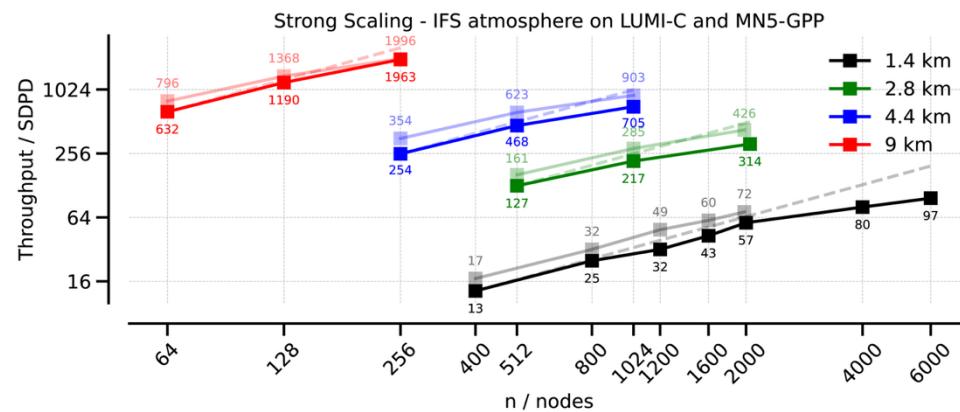
Recorded on Apple Vision Pro

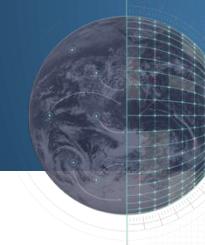


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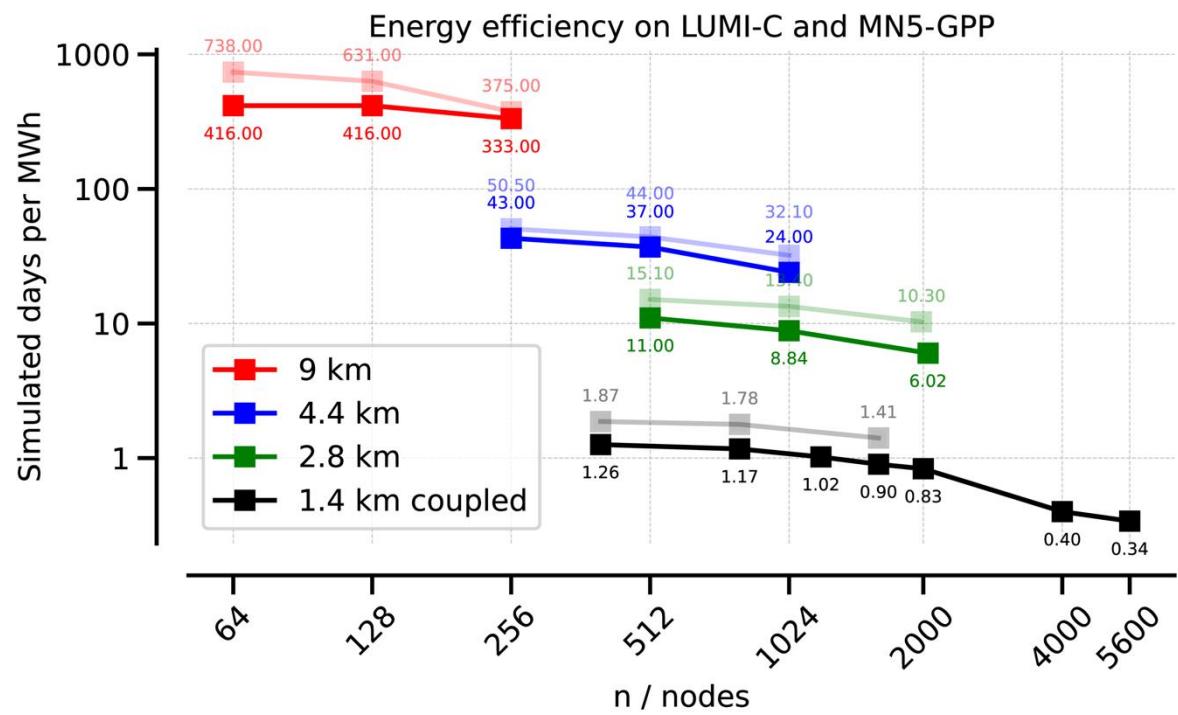


ENERGY EFFICIENCY

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





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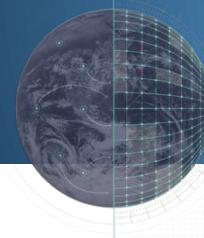
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CONCLUSIONS

- 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

