



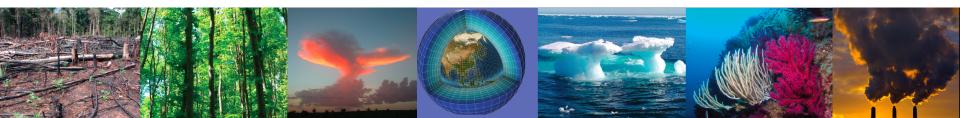
The Data Deluge in High-Resolution Climate and Weather Simulation

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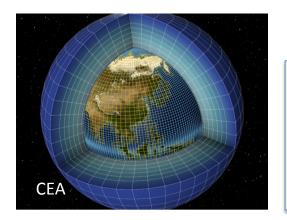
www.esiwace.eu





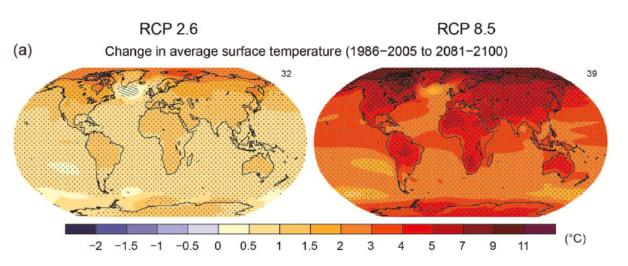
Climate and Weather Simulation

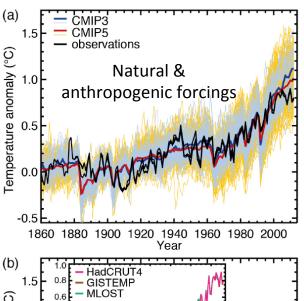


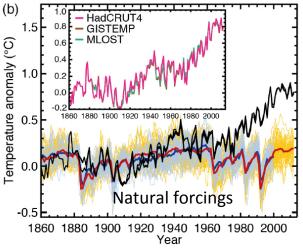


Understand & Predict Climate / Weather

IPCC (20013)









ENES Infrastructure Strategy Roadmap

Mitchell et al., 2012

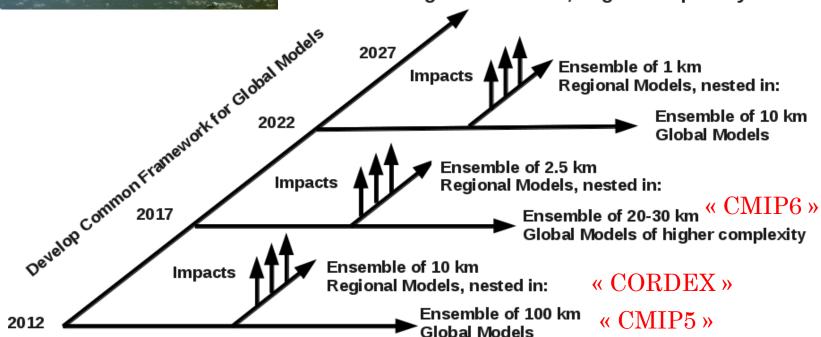
http://enes.org/



A grand challenge:

 $Towards \approx 1 \text{ km scale for atmosphere}$ resolving deep convective clouds in global climate models

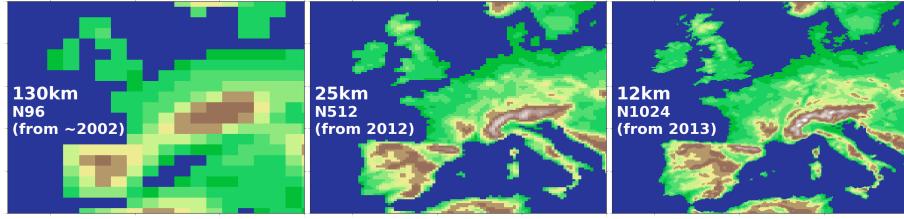
Ensemble of Global High Resolution, High Complexity



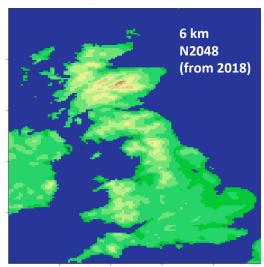


High Resolution





- With time, simulation "resolutions" are increasing
- ... but we are also producing more "ensembles", and complexity is increasing too ...
- ... more numbers are being calculated, and more numbers are being stored, for later analysis and use!



(All these pictures are from *global* climate models!)

ENES Infrastructure Strategy Roadmap



Resolution

≈ x 27

EO, **≢**Data Assim.

 $x 100 \approx x 10^6$

x 3

Computing

Resources

Needs for HPC

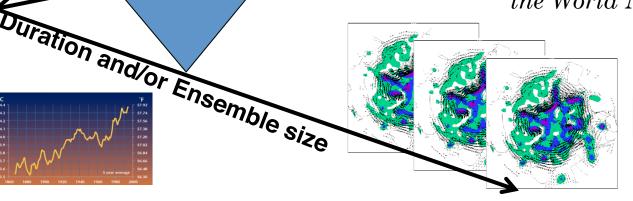
And more data outputs

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x 5-10

Complexity

From Jim Kinter, the World Modelling Summit, 2008



ensemble: x 10

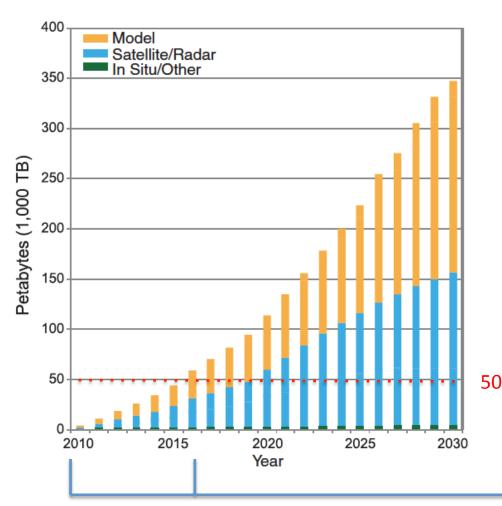
duration: x 10-100



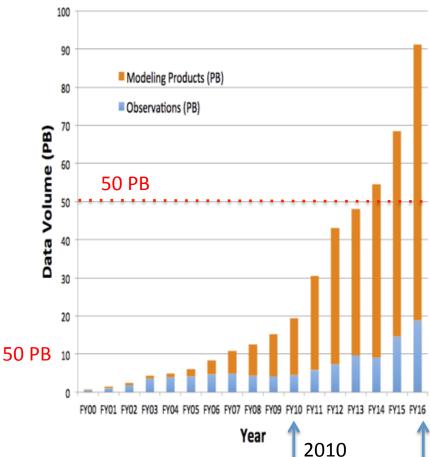
Increase of model data



Overpeck et al. (Science 2011)



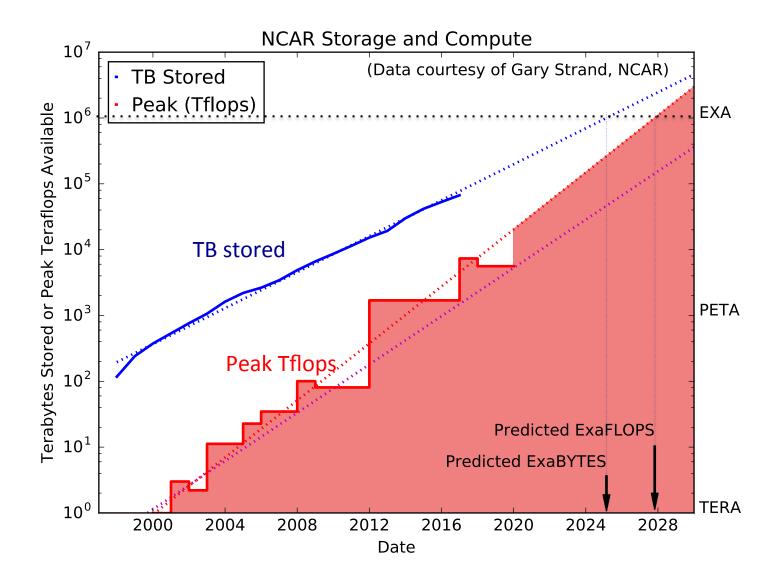
Tsengdar Lee, Icas 17 NASA Earth Science Data Growth





Scale and Growth: Continual Evolution





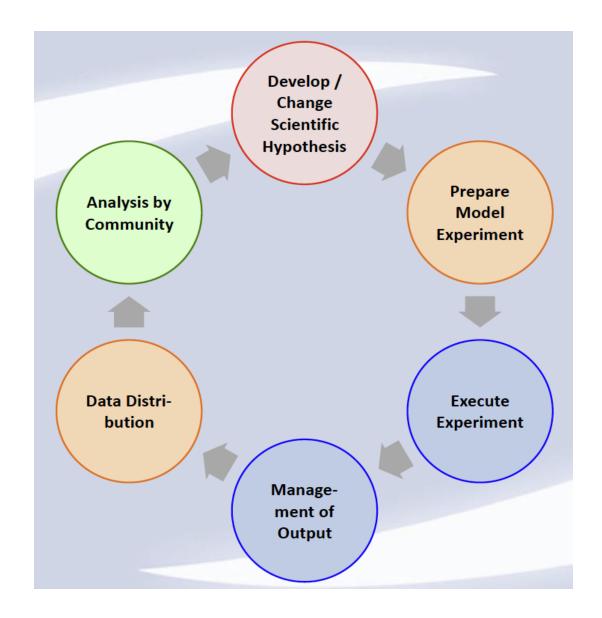


Workflow





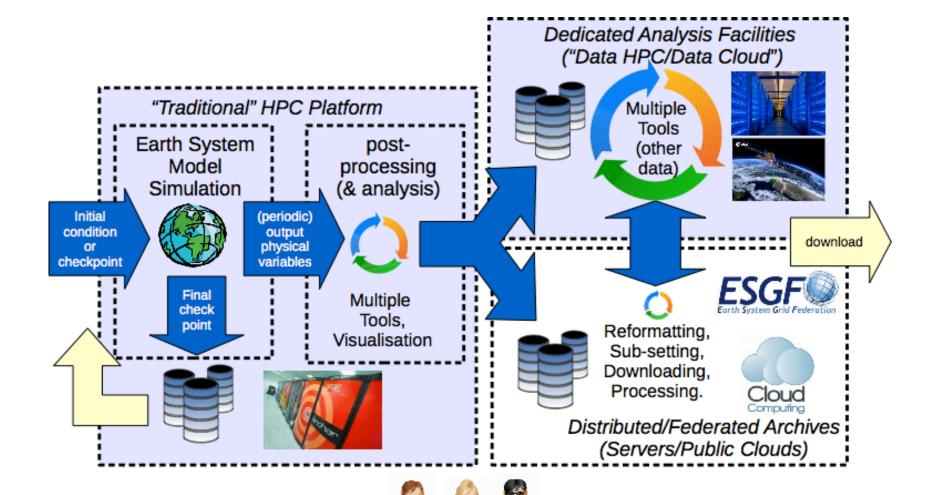
Final Report, 2017





Multiple Types of Storage & Data Interaction





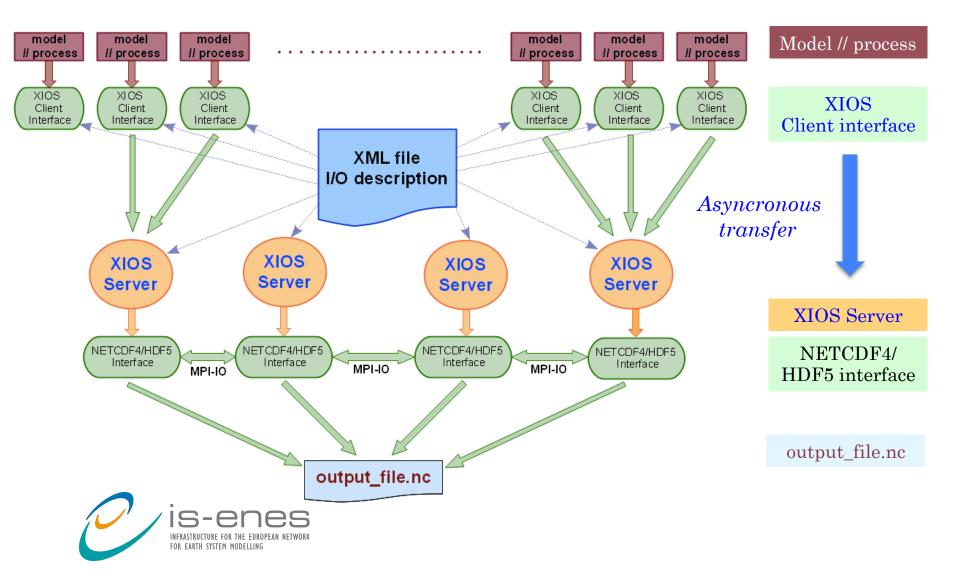
Multiple Roles, at least:

Model Developer, Model Tinkerer, Expert Data Analyst, Service Provider, Data User



(1) Management of output







(2) Dedicated Analysis Facilities



Example: JASMIN - Bringing Compute to the Data

http://jasmin.ac.uk

LOTUS

Optimised High Performance Data Analysis Environment

Moving PB

(the batch

cluster):

out of LOTUS

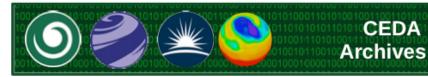
Community Cloud

Customisable

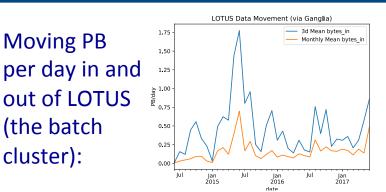
(with high performance route to archive)

CEDA Data Services

Remote access to archive & catalogues. Download etc



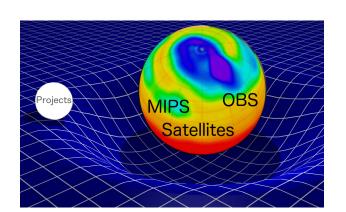
JASMIN - Data Intensive Computer Storage, Compute and Network Fabric Batch Compute, Private Cloud, Disk, Tape



The importance of data gravity; when you have data, more data

- 5 PB of CURATED POSIX archive data (and growing, with 10 PB expected in next 2 years).
- 6 PB of USER POSIX data on disk (and growing, with rapid growth expected as UK environmental science will no longer buy HPC with large local analysis disk, data from ARCHER, NEXCS, MONSOON, PRACE all expected to flow to JASMIN)!
- Lots of EPHEMERAL POSIX data (many PB more, comes and goes, need space for analysis!)

comes to you!

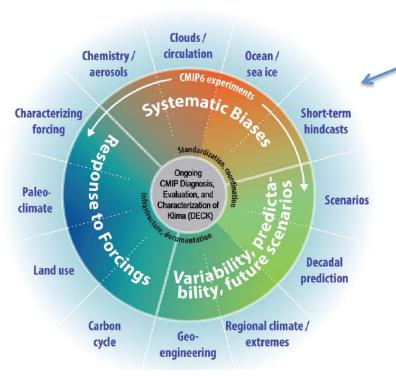




(3) Distributed Archives Model data distribution







Meehl et al. (2014)



14 000 Registered Users

CMIP5 – o(2) PB from modelling centres

CMIP6 – expected to be o(30+) PB

Managing and distributing the data via the Earth System Grid Federation (ESGF).

Includes tools for publication, cataloguing, documentation, and both download and replication.





Storage issues & Actions arising



Issues:

- **Cost:** Disk prices not falling as fast as they used to.
- **Behaviour:** Larger groups sharing data for longer, which means **data** is "hot" for longer.
- Performance: Traditional (POSIX) disk not performant at scale.
- Software: Little software for our domain which can exploit "OBJECT store" disk (hard to use the public cloud.)
- Tape: Tape remains important, particularly for large amounts of "cold" data.

Community Action: **ESIWACE "Exploitability"** work package:

- Better understanding of costs and performance of existing and near-term storage technologies.
- 2. New "Earth System Middleware" prototype
- Provides an interface between the commonly used HDF library and storage which addresses both the performance of POSIX and the usability of object stores.
- New "Semantic Storage Library" prototype:
- Python library that uses a "weather/climate" abstraction (CF-NetCDF data model) to allow one "file" to be stored across tiers of, e.g. POSIX disk, OBJECT store, and TAPE.





Cloud computing and Big Data



Three domains of interest to weather and climate community:

- New Fabric and infrastructure (private/public cloud)
 - Exploiting virtualisation to provide flexible and elastic services. Not suitable or large scale simulation, but big role to play in analysis (e.g. JASMIN).
 - Large scale use will depend on addressing usability of object stores.
- New compute paradigms emerging (in our community)
 - New ways of arranging data and scheduling compute across hardware (e.g. HADOOP, SPARK) – not used
 - Some small scale experiments reported in the literature. DASK experiments underway at the UK Met Office (http://www.informaticslab.co.uk/)
- New ways of exploiting algorithms emerging (in our community).
 - e.g. using machine learning to identifying patterns in data, something we've done for decades, but with new and (possibly) better tools.
 - Experiments comparing traditional methods to new methods are underway (e.g. at LLNL in the US) to evaluate potential.
 - Possible use for Quality Control of data (e.g. unusual field) or Parameterisations (e.g. optimal parameters)



Conclusions



- Data are a key component of climate and weather modelling
- Exabytes will be reached before exaflops!

Facing the EXA era, 3 challenges:

- Reduce the amount of data: on-the-fly analyses, sampling issue
- Better methods to write data and manage and use storage
- Data science: Better algorithms to extract and exploit

Just starting Towards a revolution!