

Empowering weather & climate forecast:

ML Apps & Datasets
ML Workflow Tools
Hardware Systems

## **Welcome & Introduction**

Peter Dueben (ECMWF)



ECMWF

#### **Timetable**







#### **Our sister** projects







#### **External** science talks

8:30 GMT — 10:30 — 11:00 — 12:30 — 13:30 — 15:30 — 17:30

Coffee

break

Introduction

Peter Dueben (ECMWF)

**ML Apps & Datasets** Bing Gong (JSC)

**ML Workflow Tools** 

Fabian Emmerich (4cast)

**Hardware Systems** 

Andreas Herten (JSC) Daniele Gregori (E4)

**Interactive part** 



**TimeX** 

Giovanni Samaey (KU Leuven) Martin Schreiber (TUM)

Deep-Sea

Estela Suarez (JSC)

Red-Sea

Nikos Xrysos (FORTH)

**Interactive part** 



Lunch break

**Time-consistent** downscaling of atmospheric fields with generative adversarial networks Jussi Leinonen (MeteoSwiss)

Pangeo: an OS ecosystem for dataintensive science

Ryan Abernathey (Columbia)

**Deep learning for** earth sciences in the **HPC** context

Thorsten Kurth (NVIDIA)

**Interactive part** 



Coffee break and more time for discussion



### Housekeeping

We will use Slido for Polls and Surveys (anonymously)
Please scan the QR code or access via slido.com using #MSC2022

As an attendee you can view the webinar but will not have video or audio functionality

Please ask questions via the Q&A option

Please raise your hands if you want to ask a question verbally and wait for a prompt to appear on your screen to allow you to unmute yourself.



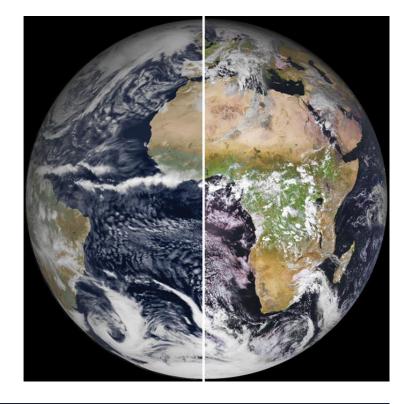


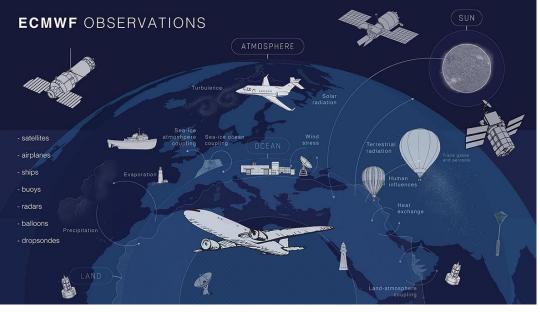
Predictions of weather and climate are difficult as the Earth system is huge, complex and chaotic, and as the resolution of our models is limited

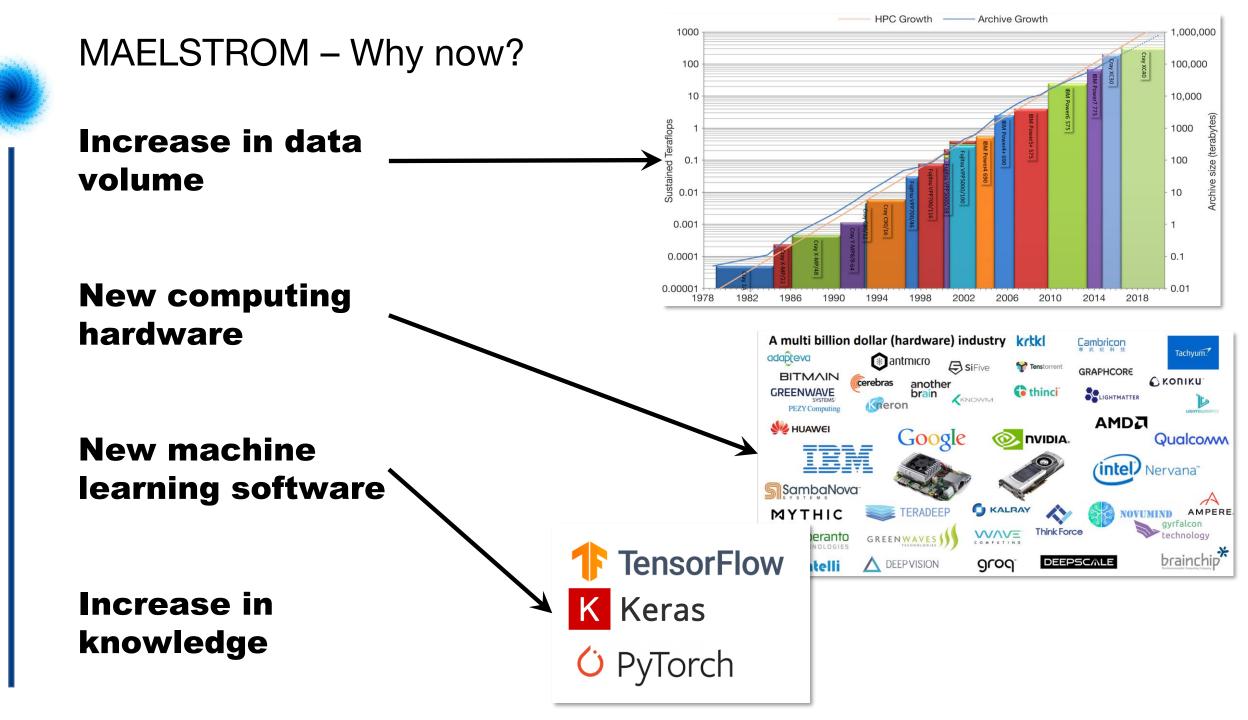
However, we have a several hundred peta-byte of Earth system data from observations and model output

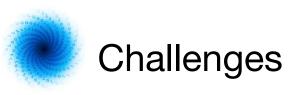
➤ There are many application areas for machine learning in numerical weather predictions







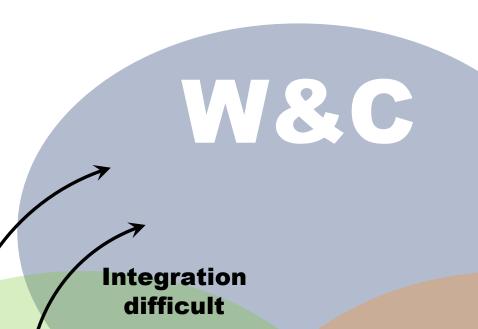




**Different** 

philosophies

& toolsets

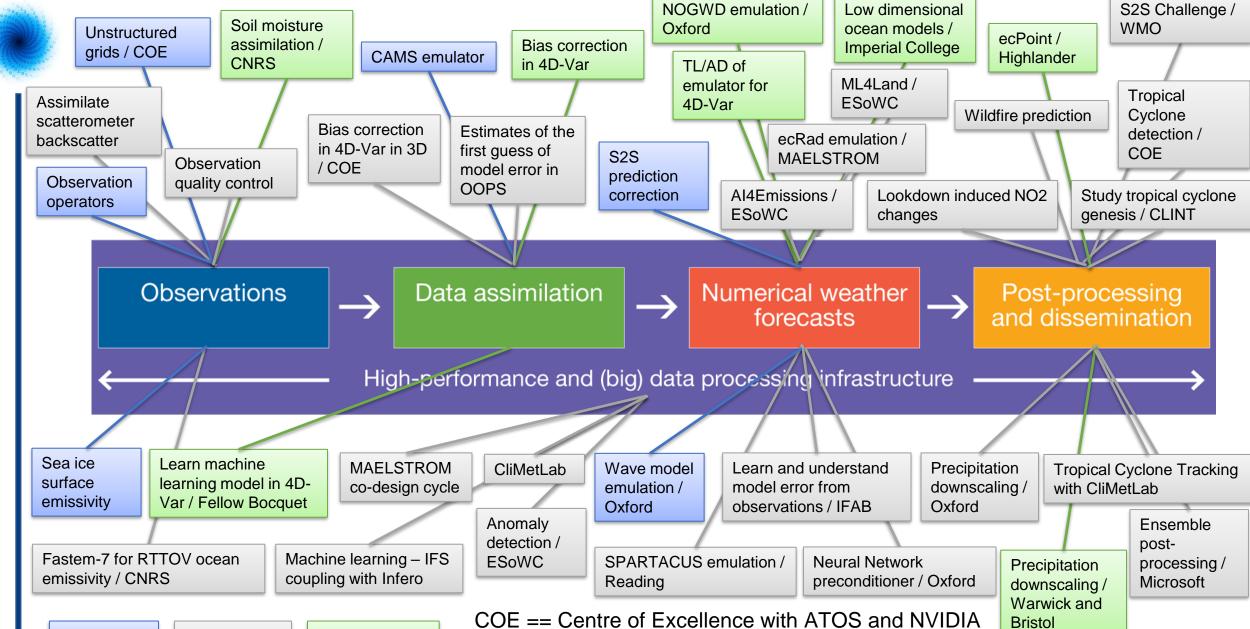


Off-the-mill tools not not proven sufficient yet

Scaling up to petaflop yet to be learnt

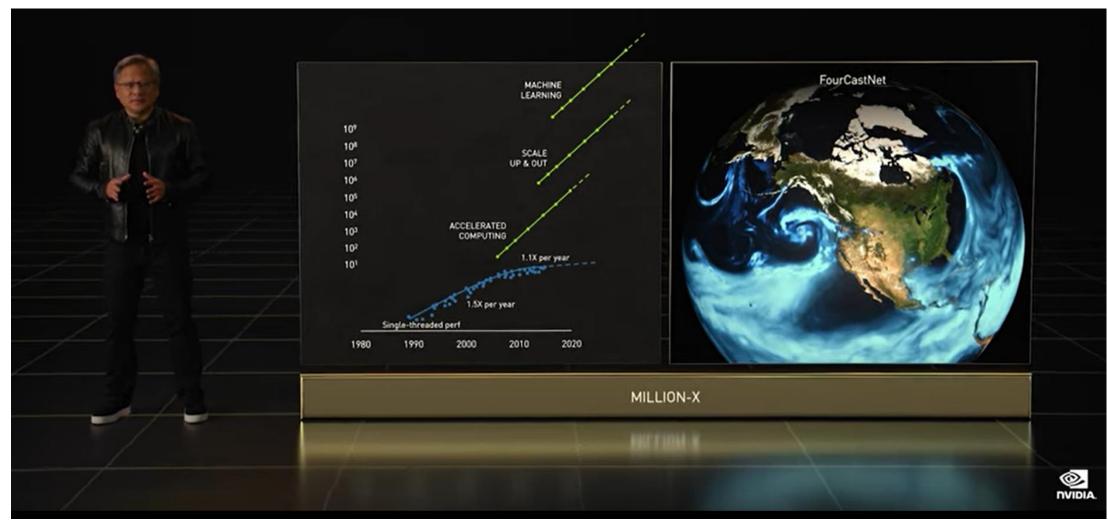
HPC

The state-of-the-art – Machine learning at ECMWF NOGWD emulation / Low dimensional Soil moisture Oxford ocean models / Unstructured ecPoint / assimilation / Bias correction Imperial College grids / COE **CAMS** emulator Highlander **CNRS** in 4D-Var TL/AD of ML4Land / emulator for Assimilate **ESoWC** 4D-Var Wildfire prediction scatterometer Bias correction



**Planned** Ongoing **Published** ESoWC == ECMWF Summer of Weather Code

# The perspective – Full ML models for weather and climate?



NIVIDA's Earth-2 is coming with FourCastNet – see Thorsten's talk Climate?



# A myriad of options...

#### A myriad of options for machine learning approaches

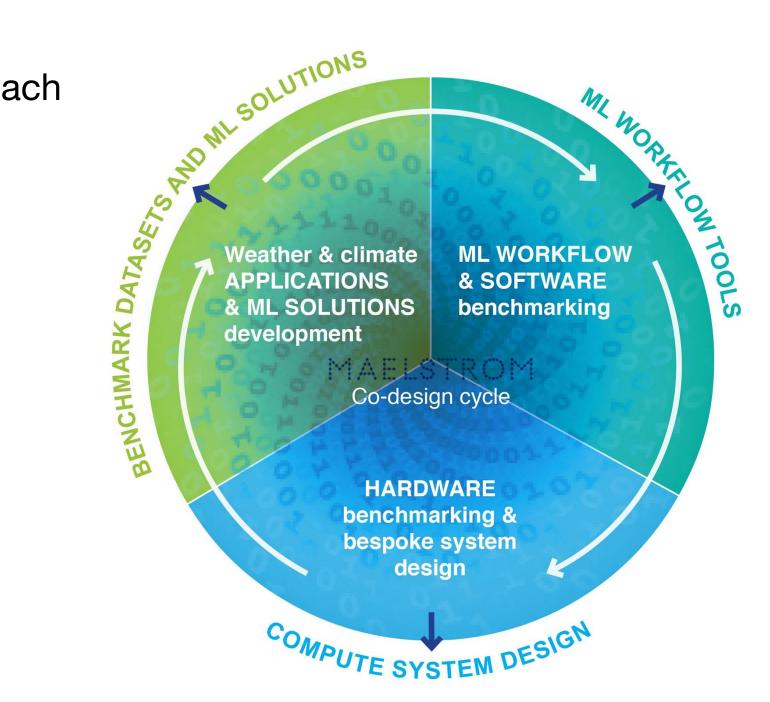
Dense Neural Networks, LSTMs, ConvGru, Attention Layers, Transformer networks, # of hidden layers, different normalisation of inputs, batch normalisation, tanh, relu, gelu, softplus, elu, selu, leaky relu, softmax, sigmoid function, generative adversarial networks, recurrent neural networks, encoding/decoding networks, random forests, boosting methods, clustering techniques, singular vector decomposition, causal discovery, ablation studies, root mean square error, variational auto encoder, gradient descent, stochastic gradient decent, adagrad, adadelta, RMSprop, Adam, # of epochs, # of batches, learning rate, overfitting, dropout, Bayesian networks, Gaussian processes, half precision, sparse networks.... Argh...

- + a myriad of options for machine learning hardware
- = confused scientists





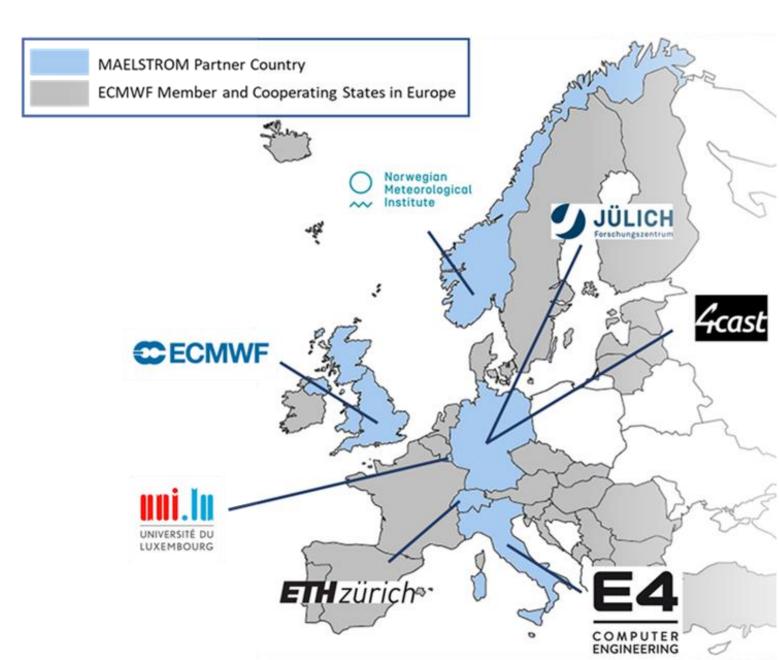
# The MAELSTROM approach





### We are MAELSTROM







# MAELSTROM – How to get involved?

- Visit our *project webpage*: <u>www.maelstrom-eurohpc.eu</u>
- Use our **benchmark datasets**
- Use our *machine learning blueprints* for other applications
- Use of machine learning workflow tools
- Use of *compute system designs*
- Talks, deliverables and publications
- Two dissemination workshops are planned for April 2022 and Spring 2024 at ECMWF
- Two hackathons foreseen (2022 in Juelich and 2023 at ECMWF)



Please also join us for the ECMWF Machine Learning Workshop Tu-Fr https://events.ecmwf.int/event/294/

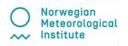














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