

Why Pangeo?

What is it and why we need it

Theo McCaie







Grains of sand



A mug full
(25th square)



The volume of a
person
(33rd square)

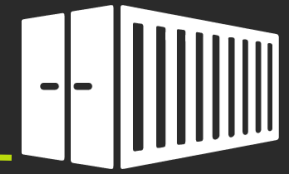


5th largest container
ship in the world
(53rd square)

| | | | | | | | |
|-------|------|------|------|------|------|-------|-------|
| 1 | 2 | 4 | 8 | 16 | 32 | 64 | 128 |
| 256 | 512 | 1024 | 2048 | 4096 | 8192 | 16384 | 32768 |
| 65536 | 131K | 262K | 524K | 1M | 2M | 4M | 8M |
| 16M | 33M | 67M | 134M | 268M | 536M | 1G | 2G |
| 4G | 8G | 17G | 34G | 68G | 137G | 274G | 548G |
| 1T | 2T | 4T | 8T | 17T | 35T | 70T | 140T |
| 281T | 562T | 1P | 2P | 4P | 9P | 18P | 36P |
| 72P | 144P | 288P | 576P | 1E | 2E | 4E | 9E |



A teaspoon full
(16th square)



In a cargo
container
(39th square)



2x
the worldwide
container
ship capacity
(64th square)

Generating more data in a week than in total 7 years ago

Increasingly big, increasingly complicated

Probabilistic / ensembles

Many formats

High dimensionality

Short use by date

Mechanistic / statistical

High volume

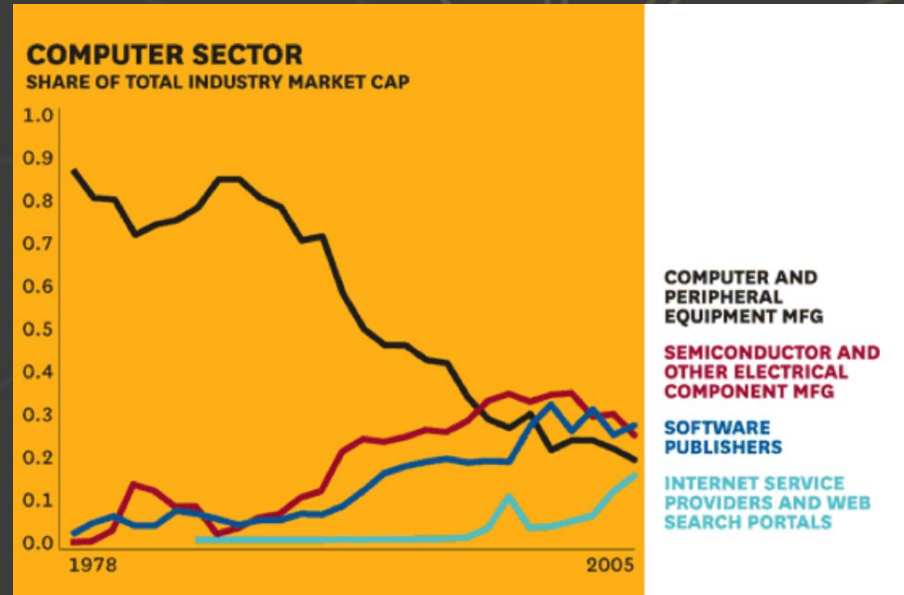
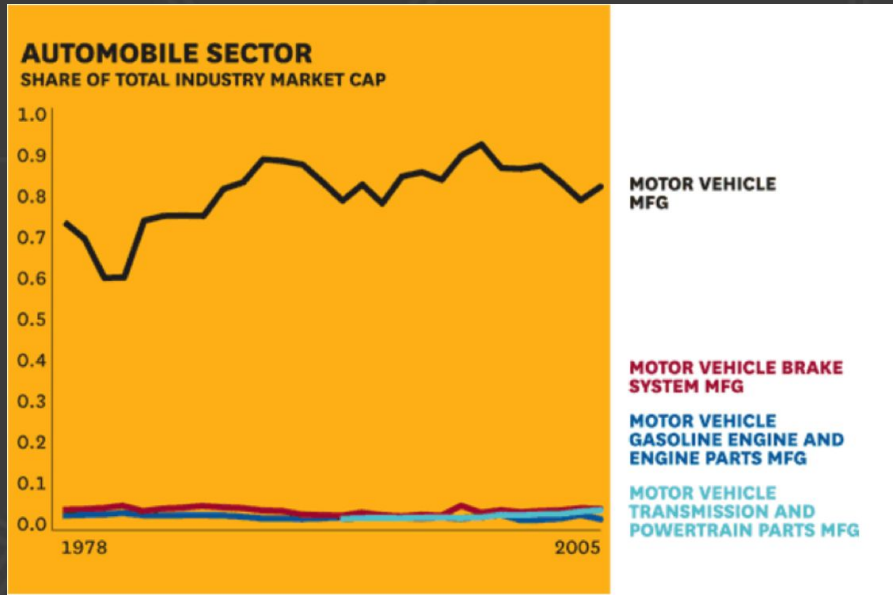
Inconsistent metadata

Hundreds of variables

High velocity



Total market capitalisation: Cars Vs Computers



<https://hbr.org/2013/07/how-to-drive-value-your-way>



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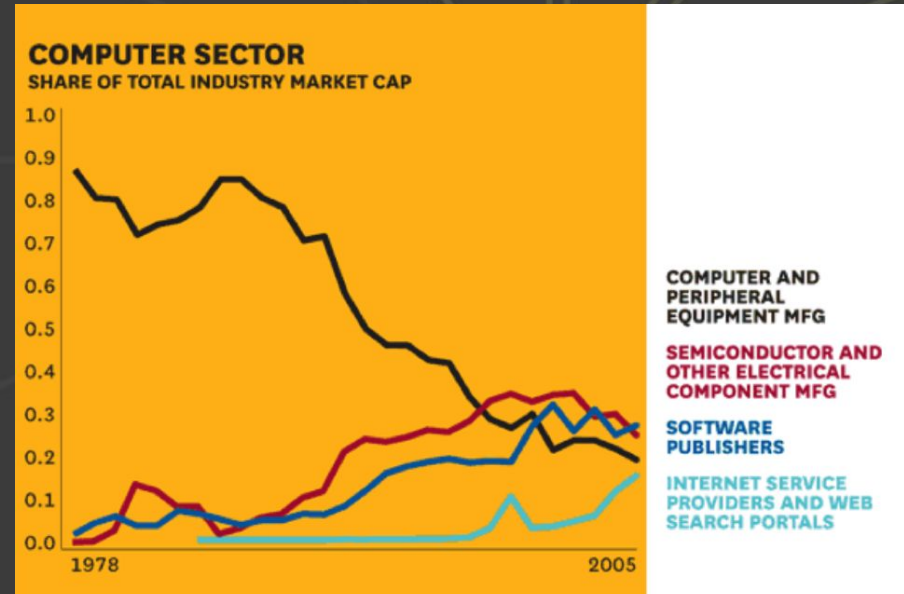
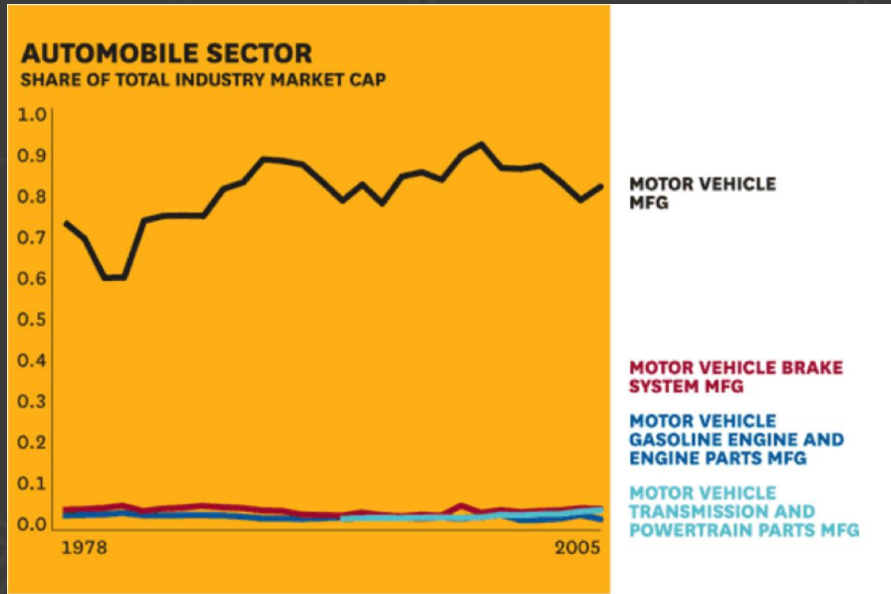


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Which one is weather forecasting?



<https://hbr.org/2013/07/how-to-drive-value-your-way>



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We are looking for a way to:

- Help people make better decisions based on complex data?
- Allow bespoke solutions to domain specific problems?
- Empower our ever more data-literate consumers?
- Unlock all the value in hundreds of PB of data?
- Provide improved accuracy without ever more flops?
- Empower analysts to do what they want not what they can?



Pangeo



=



Iris



xarray

matplotlib



kubernetes



docker



Google Cloud



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BUILD YOUR OWN PANGEO

| | | | |
|-------------------------|-----------------------------------------------------------------------------------------------|--------------------------------------------------------------------------------------------------------------------|----------------------------------------------------------------------------------------------------------------------------------------------------------|
| Storage Formats |  |  | Cloud Optimized COG/Zarr/Parquet/etc. |
| ND-Arrays |  |  | More coming... |
| Data Models |  |  | pandas $y_i t = \beta^t x_{it} + \mu_i + \epsilon_{it}$  |
| Processing Mode |  Interactive | Batch  | Serverless  |
| Compute Platform | HPC  | Cloud  Google Cloud Platform | Local  |



Iris



- Open Source (BSD license)
- Encapsulates Dask for distributed calculations
- Re-gridding/projection/interpolation
- Unit conversion
- Reads/converts various formats (Grib, NetCDF, fieldsfiles...)
- Automatic plotting via matplotlib and holoviews
- 8 FTEs at the Met Office working on it!



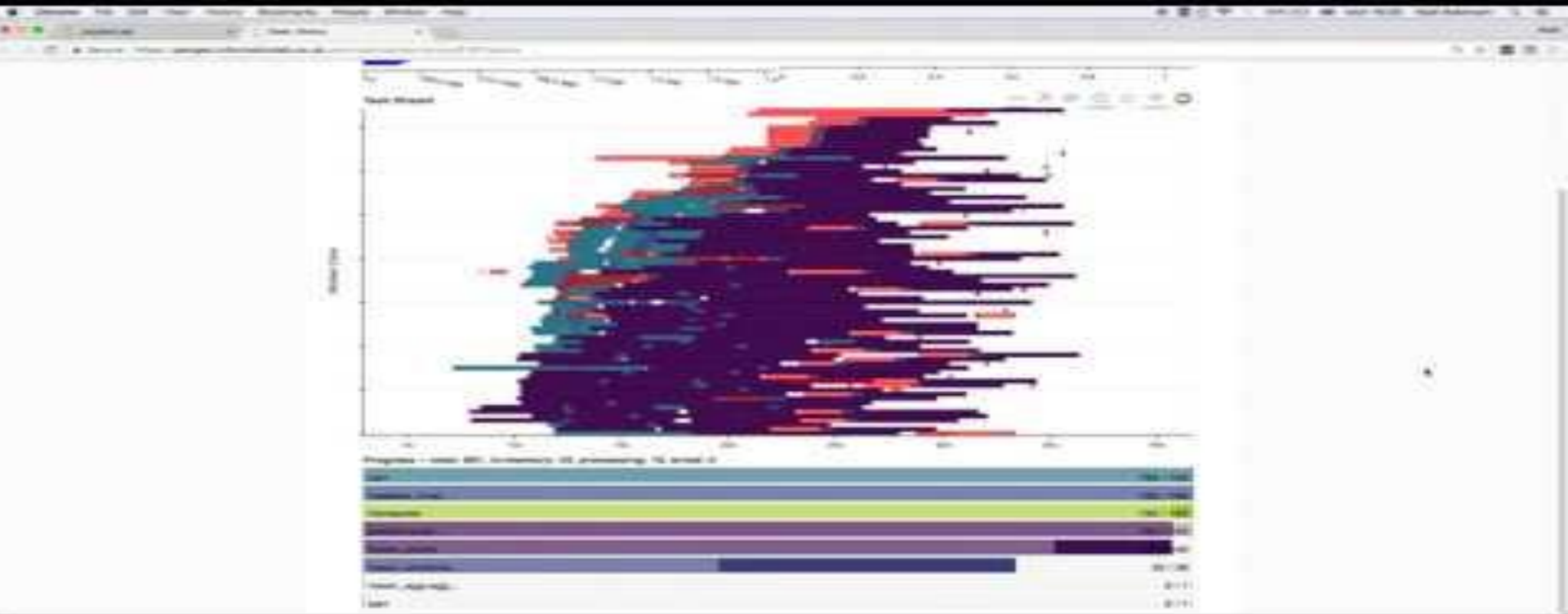
Pangeo



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- Responding to demand elastically
- Interactive analysis to encourage "flow", not fire-and-forget batch jobs
- Laziness/just-in-time
- Thin web client views to interact with data
- Agile, bespoke, product creation







Met Office InformatiCS Lab

Chat

What's the weather for Exeter on 21st December?

Weather: Wind | Clouds: 90%

Locally, for Exeter, Temperatures will reach a high of 13°C with a minimum temperature of 9 expected. Given the other conditions today this will feel like 11°C at its peak. Northerly winds will reach a maximum of 7mph. Visibility is expected to be very good with a range of between 20 and 40 km. There is a 0% chance of precipitation.

Weather: Wind | Clouds: 90%

Is that further than usual?

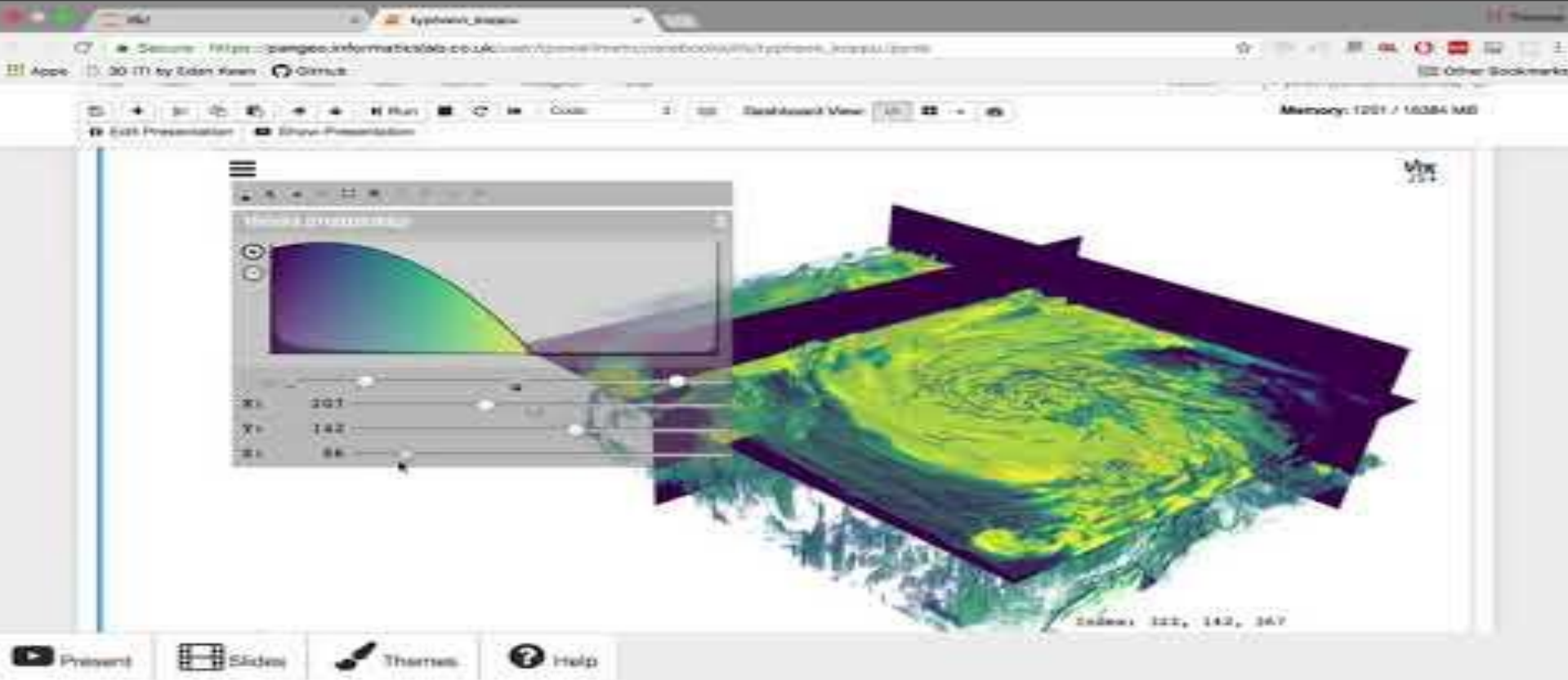
OK, let me calculate that for you...

Weather: Wind | Clouds: 90%

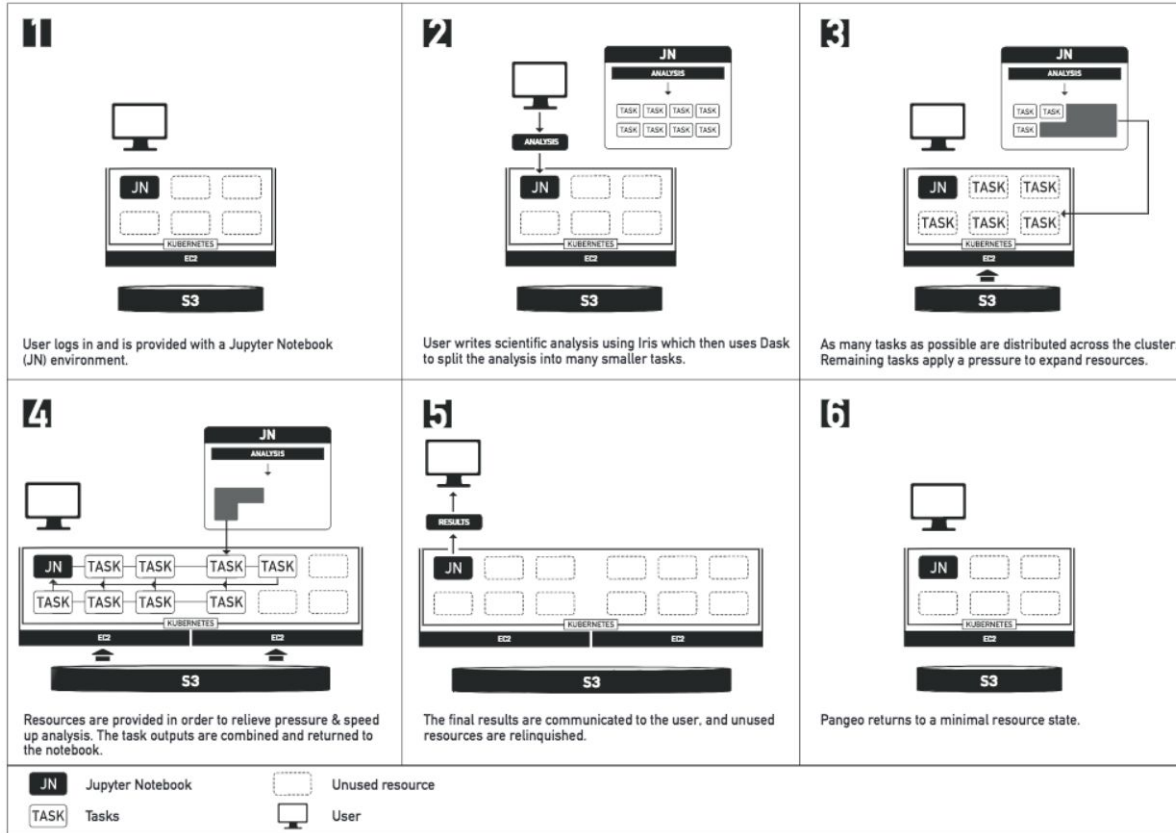
the drawer is around here somewhere...

Weather: Wind | Clouds: 90% at 10:00:00

Type your message...



The screenshot shows a web browser window with a URL starting with `https://pangeo.informaticslab.co.uk/.../typframe_30ppm/2016`. The browser's address bar and navigation controls are visible at the top. The main content area displays a 3D topographic map of a region, colored with a gradient from purple (low elevation) to yellow (high elevation). A 2D plot window is overlaid on the map, showing a curve that starts at a high value and decreases as it moves across the map. The plot window includes a title bar, a close button, and a legend. Below the plot, there are three coordinate fields: X: 207, Y: 142, and Z: 86. The bottom of the browser window features a navigation bar with buttons for 'Present', 'Slides', 'Themes', and 'Help'. The browser's status bar at the bottom right indicates 'Memory: 1201 / 16384 MB'.



<https://bit.ly/209qjr3>



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On the cloud?

- Doesn't have to be but...



Workloads are volatile by nature

On Prem this gives two options:

- | | | |
|------------------------------------------------------------------------------------------------------------------------------|----|------------------------------------------------------------------------------------------------------------------------------------------|
| <ul style="list-style-type: none">- Very big cluster- quick results- Inefficient utilisation | vs | <ul style="list-style-type: none">- Smaller cluster- suppress volatility with queues- higher utilisation |
|------------------------------------------------------------------------------------------------------------------------------|----|------------------------------------------------------------------------------------------------------------------------------------------|



Volatile workloads in the cloud

1. Scheduler creates many jobs for an individual user
2. Many schedulers submit to the same orchestrator, smoothing volatility somewhat
3. Orchestrator asks for more cloud resources in response to spikes in demand
4. Many Many users use the cloud smoothing demand a lot
5. The Cloud installs more racks in response to demand

Fast



Slow



What's next

- Data discovery - "Hey pangeo, get me data on UK storms last year"
- Science to service - one click APIs and dashboards.
- Environmental data analysis for all - deployments, tools, APIs and tutorials to make environmental data accessible to SMEs
- On demand hardware configured clusters
- Improved data storage and handling



What's next: our data challenge

- Fast metadata access
- Parallel and elastic over fast and immediately consistent
- Universally addressable
- Reluctant to embrace one size fits all
- Still need to deal with the high volume and velocity data as is currently generated

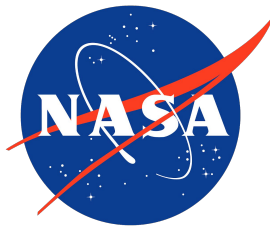


Why pangeo?





**Alfred P. Sloan
FOUNDATION**



Lamont-Doherty Earth Observatory
COLUMBIA UNIVERSITY | EARTH INSTITUTE



EARTH CUBE
TRANSFORMING GEOSCIENCES RESEARCH



Met Office

W

**UNIVERSITY of
WASHINGTON**



NCAR

NATIONAL CENTER FOR ATMOSPHERIC RESEARCH



ANACONDA

Element

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Environmental Futures & Big Data Impact Lab



ROTHAMSTED
RESEARCH

**PLYMOUTH
UNIVERSITY**



EXETER
CityFutures



**PLYMOUTH
COLLEGE
of ART**



European Union
European Regional
Development Fund

PML

Plymouth Marine
Laboratory



Met Office

Innovation is hard... and always has been

introduction of innovation...is a struggle against stupidity and envy, apathy and evil, secret opposition and open conflict of interests, a horrible period of struggle with man, a martyrdom even if success ensues.

Diesel, 1858-1913

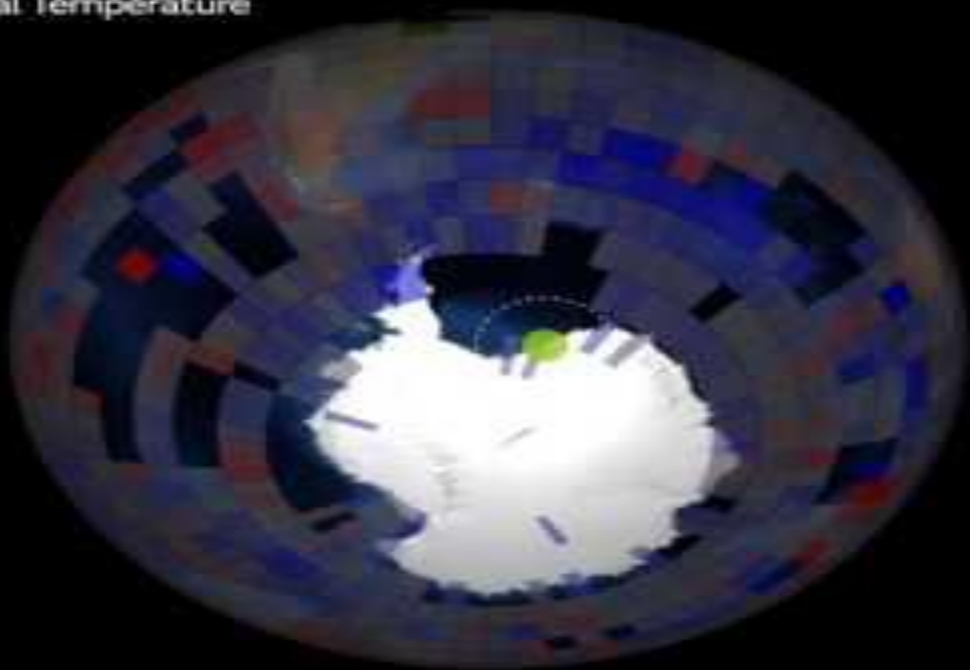


Thank you!

Met Office Global Temperature



1959



Aerosol pollution partly offsets greenhouse effect keeping global temperatures fairly constant.

Temperature measurements begin in Antarctica

-0.082

Temperature (°C) from 1961-1990 average

315

CO₂ level



