

#### **LUCA CINQUINI**

NASA JET PROPULSION LABORATORY AND CALIFORNIA INSTITUTE OF TECHNOLOGY JPL UNLIMITED RELEASE SYSTEM CLEARANCE NUMBER: #18-6942 © 2018 CALIFORNIA INSTITUTE OF TECHNOLOGY. GOVERNMENT SPONSORSHIP ACKNOWLEDGED

### Introduction

- Recent reports (e.g. 4th National Climate Assessment report) indicate that climate change is accelerating beyond earlier predictions:
  - \* Enormous economic consequences to the U.S. and world economy
  - \* Severe weather events (floods, wildfires, tornadoes...)
  - Widespread health effects
  - \* We are the last generation that can avoid a massive extinction of species
- As the world leading data infrastructure in support off climate change research, ESGF plays an important role in predicting and mitigating its effects on the whole Earth ecosystem

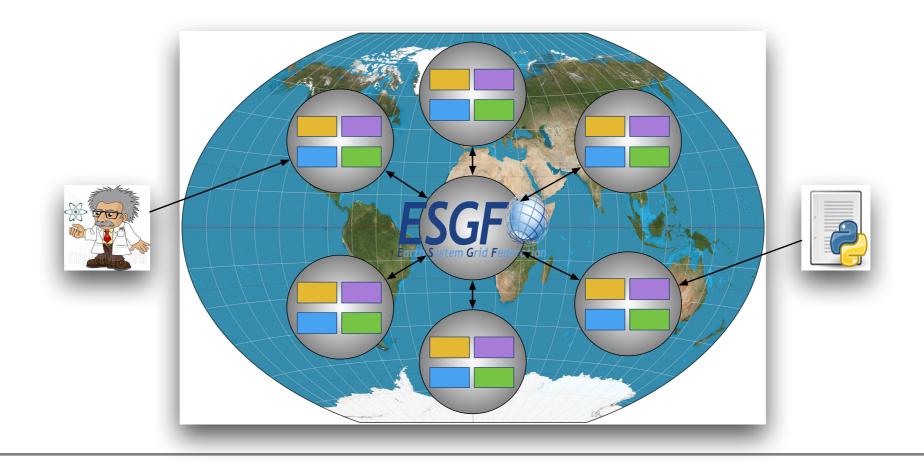






#### 2018 State of ESGF

- ESGF has made constant, solid progress in 2018: improving the reliability of the technical infrastructure, developing new functionality, expanding data holdings and user base
- Most recent stats: 31 nodes, 793,026 datasets, 10,054,190 files, 133
   CoG projects, 19,978 users



#### Review of Action Items from 2017 F2F

- Roadmap established by ESGF-SC and ESGF-XC in 2017 for 2018 (https://esgf.llnl.gov/esgf-media/pdf/ 2017-ESGF\_F2F\_Conference\_Report.pdf):
  - \* Short Term Plans for "CMIP6 Preparedness" (0-2 years):
    - \* Replication
    - \* Documentation and training for data publishers
    - \* Software and operations security
    - \* PID Service
    - \* Basic data reduction and analysis operations
    - \* User authentication and authorization
  - \* Longer Term Plans for ESGF longevity (2-5 years):
    - \* Server-side computation
    - \* Installation
    - \* Cloud computing
    - \* Programmatic access to data



### **2018 ACCOMPLISHMENTS**

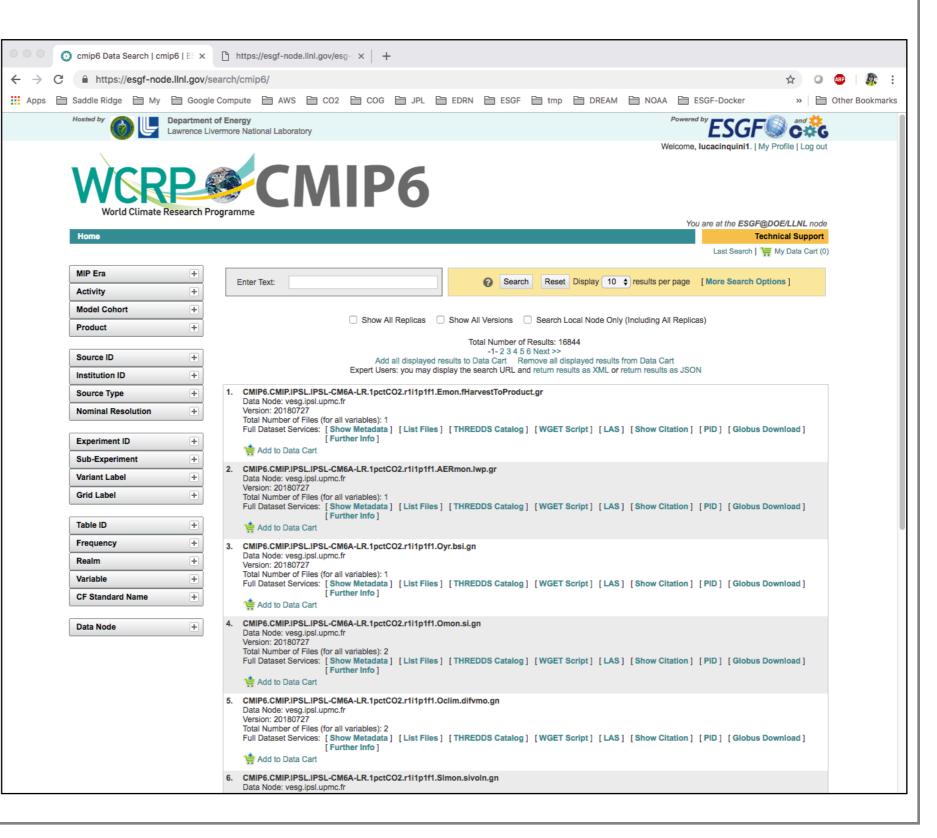
## Preparations for CMIP6

- CDNOT coordinated installation and testing of ESGF infrastructure across Nodes (S. Denvil, R. Petrie)
  - \* 5 "data challenges" held in 2018 to stress-test the system with increasingly larger amounts of CMIP6 test data - very successful
  - \* Guides for node administrators and data managers
- Replication Working Group is working at managing and improving the replication of core CMIP6 data across "Tier-1" Nodes (S. Kindermann, E. Dart)
  - \* Replica data are been published at LLNL and DKRZ with GridFTP endpoints
- WIP (WGCM Infrastructure Panel) is overseeing ESGF preparations and providing connections with the CMIP modeling groups (K. Taylor, Balaji)



# Current CMIP6 data holdings

- ESGF opened for CMIP6 data in June 2018
- Currently serving
   CMIP6 data from 4
   Data Nodes: CNRM,
   GFDL, NCCS, IPSL
- Data replicated at LLNL, DKRZ
- \* Data holdings:
  - \* 6 CMIP6 models
  - \* ~16,844 datasets
  - \* ~45,930 files



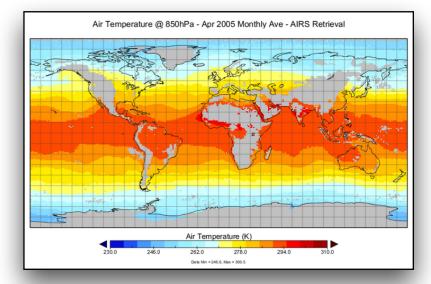
## New ESGF Services for CMIP6

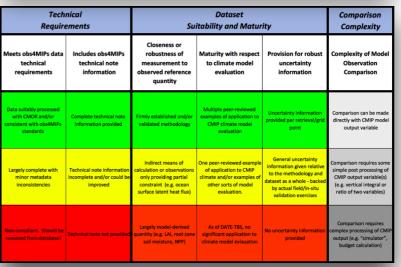
- \* New ESGF services provide enhanced functionality in support of CMIP6:
  - PID ("Persistent Identifiers") <u>service</u>: assigns PIDs to datasets and files at time of publication for long-term identification
  - \* ES-DOC: landing pages for datasets, models, experiments, CMIP6
  - \* Errata Service: central catalog for datasets that had to be retracted for various reasons
  - \* <u>DOI Data Citation</u> pages at WDC: provide information on how to cite the data, license, content, and related datasets (forcing).

| C https://furtherinfo.e                   | s-doc.org/static/index.html?target=CMIP6.IPSL.IPSL-CM6A-LR.1pctCO2.none.r1i1p1f1 | ) ← → C | â https      | ://errata.es-doc.org/static/index.html  |                   |            |         | 1        | 🖈 Q 🐵   🐉 E         |                     | ra-www.dkrz.de/WDCC/ui/cerasearch/cmip6?input=CMIP6.CMIP.IPSLIPSL-CM6A-LR.1pctCO2   |  |  |  |
|---|--|---------|--------------|---|-------------------|------------|---------|----------|---------------------|---------------------|---|--|--|--|
| ops 🗎 WRC 🗎 Saddle Ridge                  | My Google Compute AWS CO2 CO2 COG DIPL DEDRN DESGF »                             | Apps 🗎  | WRC 🛅        | Microsoft SQL Ser 🛅 Saddle Ridge 🛗 My 🛅 Google  | e Compute 🗎 AWS 🗎 | 1 CO2 🗎 CO | G 🛅 JPL |          | » 🛅 Other Bookmarks | Apps 🗎 WRC 🗎 Sado   | le Ridge 🗎 My 🛅 Google Compute 🛅 AWS 🛅 CO2 🛅 COG 🛅 JPL 🛅 EDRN 🛅 ESGF 🛅 tmp 🛅 DREAM » 🛅 Other  |  |  |  |
| CMIP6 Further Information vo.5.10 Support |  |         |              | Project:         Experiment ID:         Institution ID:         Source ID:         Variable ID:         Severity:         Status: |                   |            |         |          |                     |                     | VCRP<br>Weid Climate Research Programm  |  |  |  |
| Further Info URL: https://                | urtherinfo.es-doc.org/CMIP6.IPSL.IPSL-CM6A-LR.1pctCO2.none.r1i1p1f1              |         | IIP6         | •••••••••••••••••••••••••••••••••••••••   | ¢ 1               | ÷ ·        |         | ÷.       | 4                   |                     | CMIP6.CMIP.IPSL.IPSL-CM6A-LR.1pctCO2'   |  |  |  |
| ES-DOC Documenta                          | tion   | Total   | Issues = 16. | Filtered Issues = 16.   | Created V         | Undeted    | Closed  | Severity | Status              | General Information |   |  |  |  |
| MIP Era                                   | CMIP6  |         |              | Wrong realm ocnBgChem typo  | 2018-11-14        | 2018-11-16 | Ciused  | Low      | Resolved            | General Informat    | on  |  |  |  |
| Institution                               | IPSL   |         | CERFACS      | mong real in conception type  | 2010-11-14        | 2010-11-10 |         | 2011     | neschou             |                     | CMIP6.CMIP.IPSL_IPSL-CM6A-LR.1pctCO2  |  |  |  |
| Model                                     | IPSL-CM6A-LR   | 2       | NOAA-GFDL    | Incorrect some coordinates and cell_methods in piCont   | 2018-11-08        | 2018-11-08 |         | Medium   | New                 | Abstrac             | Coupled Model Intercomparison Project Phase 6 (CMIP6) data sets.<br>These data includes all datasets published for 'CMIP6.CMIP.IPSL.IPSL-CM6A-LR.1pctCO2' according to the Data Reference Syntax defined as   |  |  |  |
| Model                                     |  | з       | NOAA-GFDL    | Error in variable "comment" metadata  | 2018-11-01        | 2018-11-16 |         | Low      | New                 |                     | 'mip_era.activity_id.institution_id.source_id.experiment_id.member_id.table_id.variable_id.grid_label.version'. The Earth System Model IPSI-CM6A-LR. released in 2017. includes the components:   |  |  |  |
| Experiment                                | 1pctCO2  | 4       | NOAA-GFDL    | albisccp erroneous data units   | 2018-10-29        | 2018-11-16 |         | Low      | New                 |                     | The Earth System Model IrS-L-MAR-LN, released in 2017, includes the components:<br>atmos: LMDZ (NPv6, N95; 144 x 143 longitude/latitude; 79 levels; top level 40000 m), land: ORCHIDEE (v2.0, Water/Carbon/Energy mode), ocean:<br>NEMO-OPA (eORCA1.3, tripolar primarily idee; 362 x 332 (longitude/latitude; 75 levels; top orid cell 0-2 m), ocnBachem: NEMO-PISCES, sealce: NEM |  |  |  |
| Ensemble Description                      | N/A  | 5       | IPSL         | 300 years extension for abrupt-4xCO2  | 2018-10-22        | 2018-10-22 |         | Low      | Resolved            |                     | HENOLOGY (EORALIS, cripolar primarity ruleg, 362 X 352 longitude/autuale, 75 levels, top gild dei 0/2 in), ocinigcheni. NewOPISCES, sealce. New<br>LIM3.<br>The model was run by the Institut Pierre Simon Laplace. Paris 75252, France (IPSL) in native nominal resolutions: atmos: 250 km, land: 250 km.  |  |  |  |
| Machine Performance                       | N/A  | 6       | IPSL         | Irrelevant CFC in experiment other than historical  | 2018-10-19        | 2018-10-23 |         | Low      | Resolved            |                     | ocean: 100 km, ochBgchem: 100 km, sealce: 100 km.   |  |  |  |
|   |  | 7       | IPSL         | Instabilities which lead to erroneous values of tas a   | 2018-10-16        | 2018-10-16 |         | Critical | On Hold             |                     | Project: These data have been generated as part of the internationally-coordinated Coupled Model Intercomparison Project Phase 6 (CMIP6; see also GMD Special Issue: http://www.geosci-model-dev.net/special_issue590.html). The simulation data provides a basis for climate research designed to  |  |  |  |
| <b>Dataset Documentat</b>                 | ion  | 8       |              | tas instabilities lead to erroneous values of tasmax  | 2018-10-05        | 2018-10-16 |         | Critical | On Hold             |                     | answer fundamental science questions, and the results will undoubtedly be relied on by authors of the Sixth Assessment Report of the<br>Intergovernmental Panel on Climate Change (IPCC-AR6).   |  |  |  |
| Dataset ESGF Search N/A                   |  | 9       |              | Versioning errors for 1pctCO2 and abrupt-4xCO2  | 2018-07-27        | 2018-07-27 |         | Critical | Resolved            |                     | CMIP6 is a project coordinated by the Working Group on Coupled Modelling (WGCM) as part of the World Climate Research Programme (WCRP). Phase   |  |  |  |
| Dataset Errata                            | N/A  | 10      |              | Wrong realm "ocnBgChm" typo   | 2018-07-26        | 2018-08-08 |         | Low      | Resolved            |                     | builds on previous phases executed under the leadership of the Program for Climate Model Diagnosis and Intercomparison (PCMDI) and relies on the<br>Earth System Grid Federation (ESGF) and the Centre for Environmental Data Analysis (CEDA) along with numerous related activities for implementation   |  |  |  |
|   |  | 11      |              | Unchanged PIDs for new version  | 2018-07-20        | 2018-07-21 |         | High     | Resolved            |                     | The original data is hosted and partially replicated at a federated collection of data nodes, and most of the data relied on by the IPCC is being archived<br>for long-term preservation at the IPCC Data Distribution Centre (IPCC DDC) hosted by World Data Centre for Climate (WDCC) at DKRZ.  |  |  |  |
| Dataset Citation(s)                       | https://cera-www.dkrz.de/WDCC/meta/CMIP6/CMIP6.CMIP.IPSL.IPSL-CM6A-LR.1pctCO2    | 12      |              | Some sea ice variables in 3D instead of 1D  | 2018-07-12        | 2018-07-17 |         | Low      | Resolved            |                     | The project includes simulations from about 90 global climate models and around 40 institutions and organizations worldwide Project website:<br>https://pcmdi.llnl.gov/CMIP6.   |  |  |  |
| Other Documentation                       |  | 13      | IPSL<br>IPSL | Integers instead of PFTs names  | 2018-07-02        | 2018-10-12 |         | Low      | Resolved            | Subjects            | nctps://pcmtu.umi.gov/umiPo.<br>CMIP6_CMIP.IPSL.IPSL-CM6A-LR.1pctCO2 (DRS: http://github.com/WCRP-CMIP/CMIP6_CVs)<br>CMIP6  |  |  |  |
|   |  | 14      |              | Integers instead of ocean passages names "area:coordinates" attribute is missing  | 2018-07-02        | 2018-07-17 |         | Low      | Resolved            | Rights              | climate<br>Creative Commons Attribution 4.0 International License (CC BY-SA 4.0)  |  |  |  |
| WCRP CMIP6 Homepage                       | https://www.wcrp-climate.org/wgcm-cmip/wgcm-cmip6                                | 15      | IF GL        | aroa.coordina.do diulipute lo midoling  | 2010-07-02        | 2010-07-17 |         | LOW      | masomad             |                     | CMIP6 model data is evolving in the sense that datasets are changed and added as new versions. The author list and the title are not final, either. Cite this data collection including the latest dataset version according to the Data Citation Guidelines (http://bit.ly/2gBCugM ). Individuals using the data   |  |  |  |

## Other ESGF Development

- Obs4MIPs serving more observational data, better (R. Ferraro, P. Gleckler, D. Waliser and P. Durack)
  - New specification for dir structure, filenames, search facets that is aligned with CMIP6 (ODSv2.1)
  - "Dataset Indicators" matrix captures the "maturity level" for model evaluation
- Installation Working Team: classic shell-based installer and new Python-based installer (P. Dwarakanath, S. Ames, W. Hill)
- Idea Working Team: transitioning the current ESGF Security infrastructure (based on OpenID 2.0) to more current industry standards: OAuth2 and OpenID-Connect (P. Kershaw)
- \* <u>ESGF publisher and ESG prep</u> several upgrades to support CMIP6 and improve performance (S. Ames, G. Levavasseur)
- <u>Dashboard team</u> integrating the information provider into the installer and supporting the central metrics aggregator site, also developing custom view for CMIP6 (S. Fiore, A. Nuzzo, M. Mirto)



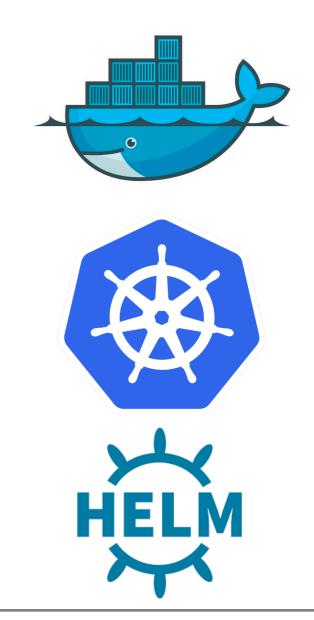




## ESGF NEW DIRECTIONS

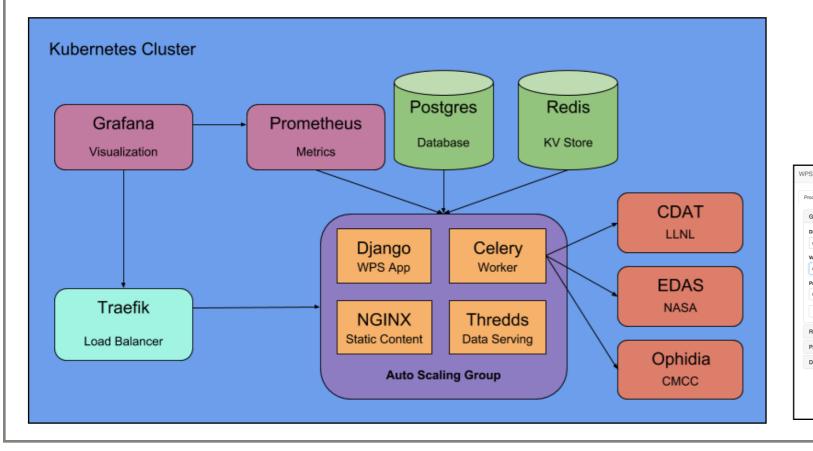
### Containerization

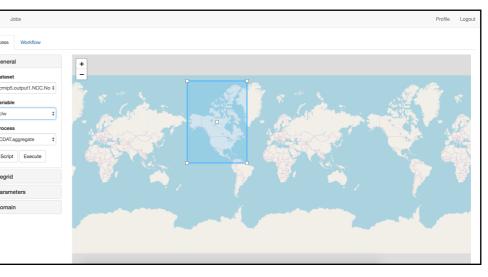
- ESGF/Docker: alternative architecture for ESGF Node where all services are packaged, deployed and managed as Docker containers
- \* Advantages of container based architecture ("micro-services"):
  - \* Easier to deploy and test
  - More flexible
  - More scalable
  - \* Easier to evolve
- \* ESGF/Docker first release in September 2018
  - \* Stable but not feature complete (no Globus)
  - \* Based on Docker, Kubernetes and Helm



### Compute Node

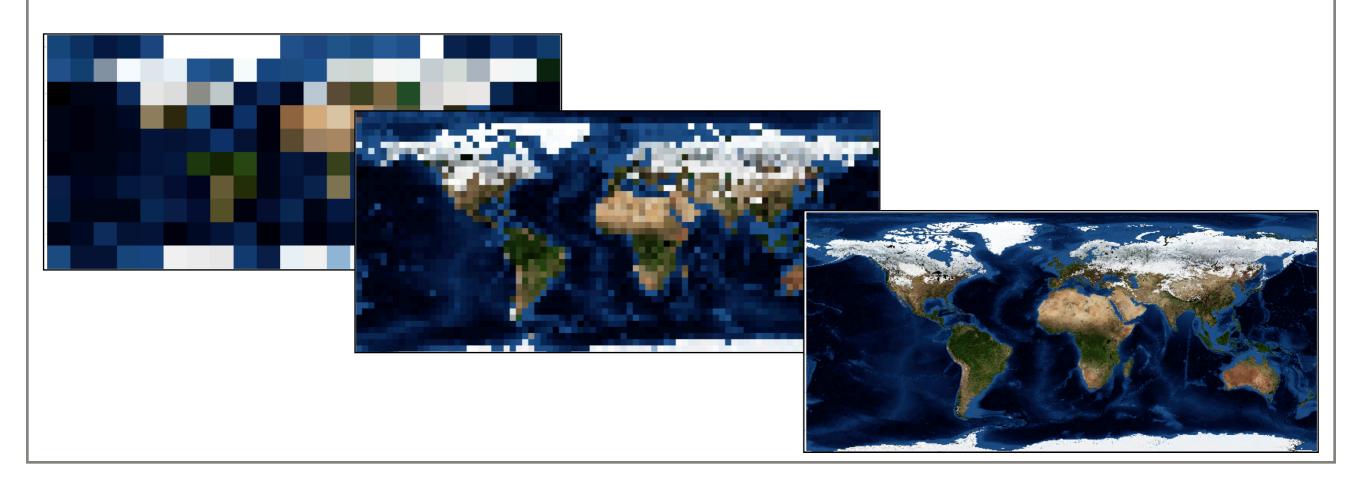
- \* The ESGF Compute Working Team has made great progress in developing scalable computing capabilities for ESGF (J. Boutte, C. Doutriaux, T. Maxwell, T. Landry)
- \* Architecture of compute node was designed from the ground up as a system of interacting Docker containers => highly scalable - both horizontally and vertically
- \* ESGF Compute API implemented by 3 back-ends (sub-set, average, min/max, etc.)
- \* Status: converted to Kubernetes+Helm, ready to be deployed w/ ESG/Docker stack





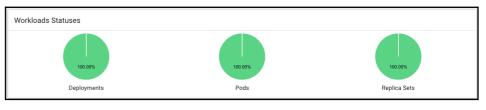
### Visus

- \* Visualization engine developed by University of Utah (S. Petruzza)
  - \* Streaming climate datasets at multiple resolutions
  - \* Data converted on the fly from NetCDF to IDX
  - \* Finalizing the integration with ESGF/Docker



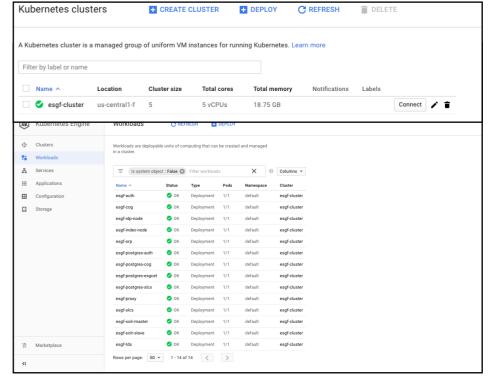
# Moving to the Cloud

- ESGF is experimenting with moving its services -all or in part- to the Cloud
- Cloud advantages: practically unlimited scalability, high availability, managed resources
- \* Cloud challenges: cost model, new architecture designs
  - How to deploy on a cluster of nodes, how to persist data, how to plan for failure
- Several efforts undergoing:
  - ESGF/Docker with Kubernetes is immediately suitable for Cloud deployment
  - GFDL is running a prototype node on Google GKE, published some CMIP6 data, enabling access to Pangeo via openDAP
  - GSFC/JPL planning to deploy a single ESGF/NASA node on AWS GovCloud
  - New Index Node architecture based on Solr Cloud, stable deployment on AWS for several months



| Pods                                |   |          |             |            |   | Ŧ |
|-------------------------------------|---|----------|-------------|------------|---|---|
| Name 🜩                              | Node  | Status 🌩 | Restarts    | Age ≑      |   |   |
| esgf-index-node-864c6448c7-c6fkk    | ip-192-168-195-203.us-west-<br>2.compute.internal | Running  | 0           | 21 minutes | = | : |
| esgf-sics-85b9fff9d4-fhkvh          | ip-192-168-195-203.us-west-<br>2.compute.internal | Running  | 0           | 33 minutes | = | : |
| esgf-postgres-slcs-57b5c97f47-4hmxf | ip-192-168-195-203.us-west-<br>2.compute.internal | Running  | 0           | 33 minutes | = | : |
| esgf-tds-756845bbb9-48p8f           | ip-192-168-157-180.us-west-<br>2.compute.internal | Running  | 0           | 2 hours    | = | : |
| esgf-orp-6fc779df47-z5z7r           | ip-192-168-195-203.us-west-<br>2.compute.internal | Running  | 0           | 3 hours    | ₽ | : |
| esgf-cog-67486c98d5-smdlc           | ip-192-168-157-180.us-west-<br>2.compute.internal | Running  | 0           | 3 hours    | = | : |
| esgf-postgres-cog-78ff645bf6-5m2zm  | ip-192-168-195-203.us-west-<br>2.compute.internal | Running  | 0           | 3 hours    | = | : |
| esgf-idp-node-556b5d567b-t8s7q      | ip-192-168-157-180.us-west-<br>2.compute.internal | Running  | 0           | 3 hours    | ₽ | : |
| esgf-proxy-784589854d-79hdj         | ip-192-168-195-203.us-west-<br>2.compute.internal | Running  | 0           | 3 hours    | ≡ | : |
| esgf-solr-slave-6b84b5cdb9-5n29d    | ip-192-168-157-180.us-west-<br>2.compute.internal | Running  | 0           | 3 hours    | ≡ | : |
|                                     |   |          | 1 - 10 of 1 | 2  < <     | > | > |

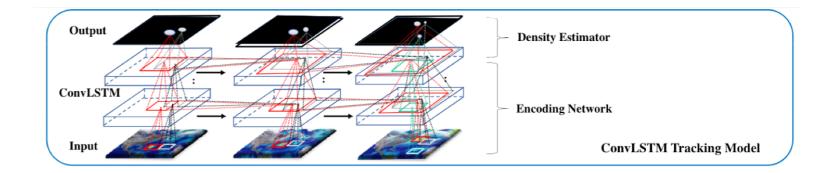
#### AWS EKS



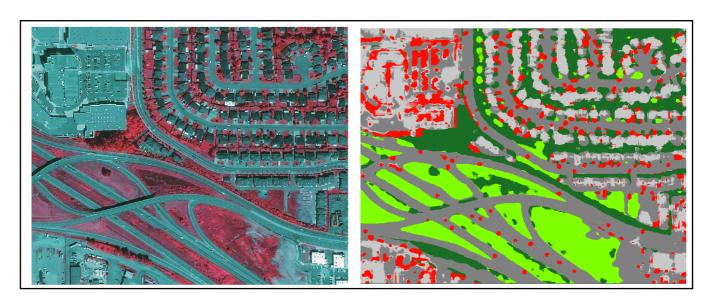
**GCP GKE** 

## Machine Learning

- \* How to mine the vast amounts of data held by ESGF to make reasonable predictions on future global climate and weather events?
- LLNL: "Deep Hurricane Tracker" model analyzes patterns in climate simulation data to predict hurricane tracks (S. Kim)
- CCMC: High Performance Data Analytics and Machine Learning using Ophidia - an infrastructure for executing declarative, parallel, server side analytics workflows (S. Fiore)
- CRIM: working with OGC to advance ML&DL capabilities for high resolution satellite images (T. Landry)



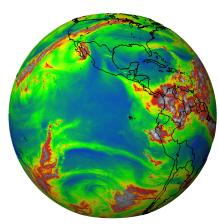


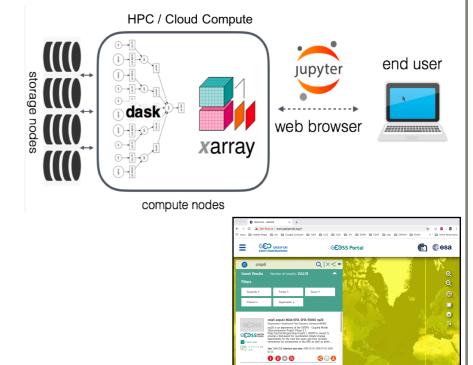


## **KEY CHALLENGES**

#### Key Challenges for 2019 and Beyond

- \* Scalability
  - A container based architecture is highly scalable, but the underlying applications must be scalable
  - \* Publishing services, data catalogs (TDS), and display of search results
- \* Easy Data access
  - \* Improve the wget scripts, provide alternative clients
  - \* Better support for subsetting at the source, over space and time aggregations
- Server side distributed computing
  - \* Deploy the Compute Node operationally
  - \* Enable workflows that span multiple steps, at multiple sites
- \* Interoperability
  - \* NASA DAACs, ESA, Copernicus
  - \* Pangeo
  - \* GEOSS: Global Earth Observations System of Systems





#### Dear Colleagues:

My apologies for not attending this year's 2018 ESGF Conference. However, I know you are in great hands with the SC and XC committees. I am proud to be a part of this international team and you should be proud of another great year of contributions to the ESGF and climate change community efforts! Deadlines are being met and climate scientists are using ESGF to address one of the most pressing challenges of the day and the future. Without you NONE of this would be possible.

Again, I thank each and everyone of you for your contributions to ESGF and making it what it is today, "The leading climate simulation distributed data warehouse".

I hope to see everyone soon as I recover from my illness.

Best regards,

Dean N. Williams

**ESGF** Chair

