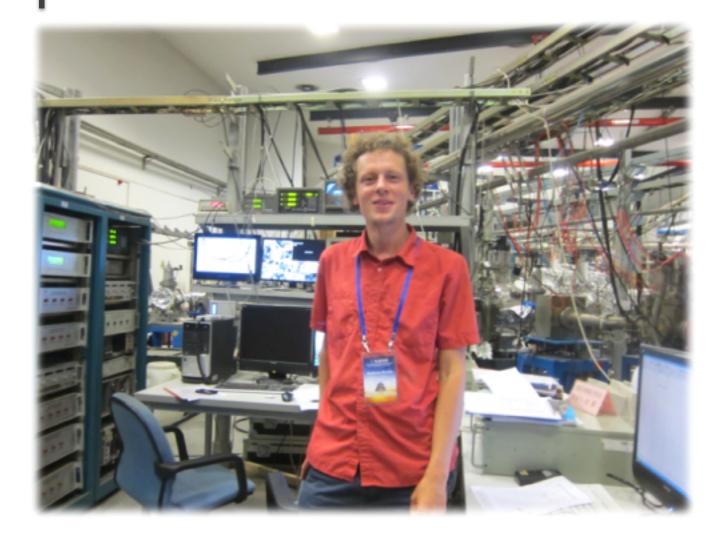


### **AWS for Scientific Workflows**

Unidata workshop, June 2018 Kevin Jorissen jorissen@amazon.com



BIO



#### Kevin Jorissen Seattle

Kevin 10 years of experience in has computational science, and holds a Ph.D. in Physics. He developed codes solving the quantum physics equations for light absorption by materials, taught workshops to scientists worldwide, and wrote about high performance computing in the cloud before it was fashionable. He worked as a postdoctoral researcher in Antwerp, Lausanne, Seattle, and Zurich. He contributed to the WIEN2k code (Density Functional Theory calculations of material properties, www.wien2k.at) and the FEFF code (Xand Electron absorption ray spectra, www.feffproiect.org).

Kevin joined Amazon in 2015 to help accelerate the adoption of cloud computing in the scientific community globally.

#### Agenda

Unidata ask: new technologies & skills transfer



Warmup

- 1. Running models, HPC, Clusters
- 2. Data Lakes
- 3. Containers, AWS Batch, Microservices
- 4. Serverless Computing
- 5. Machine Learning, Amazon SageMaker, Notebooks





### **Thank You & Homework**

jorissen@amazon.com

Sign up for the Researchers Handbook for AWS at aws.amazon.com/rcp . Browse data at https://registry.opendata.aws

- Alces Flight compute cluster NAMD tutorial: Launch "Performance Compute (SGE)" cluster at <u>https://launch.alces-flight.com/default/launch</u>, wait for e-mail confirmation, then tutorial from <u>http://docs.alces-flight.com/en/stable/getting-started/environment-usage/using-openfoam-with-alces-flight-compute.html</u>
- 2. Containers + AWS Batch for DNA sequencing: https://github.com/awslabs/aws-batch-genomics
- 3. Containers WRF Big Weather Web: www.bigweatherweb.org
- 4. Serverless Computing PyWren: <u>http://pvwren.io/pages/gettingstarted.html</u> then <u>https://github.com/pvwren/examples/</u>
- 5. SageMaker Machine Learning labs: files from https://bit.lv/2HhD2SG ; instructions at https://github.com/wleepang/sagemaker4research-workshop ; further labs at https://developmentseed.org/blog/2018/01/19/sagemaker-label-maker-case/ and https://aws.amazon.com/blogs/machine-learning/simulate-quantum-systems-on-amazon-sagemaker/

### **AWS and Scientific Workflows**

1



# AWS and Scientific Workflows

- Agility == "time to discovery"
  - Availability of resources, scalability, right-sizing
  - Experiment, fail fast, avoid undifferentiated work

# AWS and Scientific Workflows

- Agility == "time to discovery"
  - Availability of resources, scalability, right-sizing
  - Experiment, fail fast, avoid undifferentiated work

### Collaboration

- Data lake model
- Security
- Sharing
- Infrastructure
- Analytics

# Hot off the presses: WWPS AWS Summit

Real-Time Machine Learning on Satellite Imagery: How DigitalGlobe Uses Amazon SageMaker to Massively Scale-up Information Extraction from Satellite Imagery

Using AWS and Open Data to Meet the Demands of Disaster Response Situations

Transitioning Geoscience Research to the Cloud: Opportunities and Challenges

AWS Public Datasets: Learnings from Staging Petabytes of Data for Analysis in AWS

Enabling Sustainable Research Platforms in the Cloud

Enabling Research using Hybrid HPC Cloud Computing

Precision Medicine on the Cloud

Transforming Research in Collaboration with Funding Agencies

Enabling Research using Hybrid HPC Cloud Computing

Innovation on the Edge: How Rapid Experimentation with Technology is Achieving Results in the Enterprise With NASA JPL

Accelerating Analytics for the Future of Genomics

Analyzing Data Streams in Real Time with Amazon Kinesis: PNNL's Serverless Data Lake Ingestion

Empowering Every Brain! How Brain Power is using AWS-Powered AI in their Mission to Help People with Autism and Other Brain-Related Challenges

... Soon available at <a href="https://www.youtube.com/user/AmazonWebServices/videos">https://www.youtube.com/user/AmazonWebServices/videos</a>

# Hot off the presses: WWPS AWS Summit

"Earth and Space on AWS" Day

- How Element 84 Raises the Bar on Streaming Satellite Data (Element 84)
- Machine Learning with Earth Observation Imagery (EOS Data Analytics, DevelopmentSeed)
- Making Sense of Remote Sensing (Sinergise, SkyWatch)
- Black Sky: Advancing the Geospatial Revolution with Cloud-First Approach (SpaceFlight Industries)
- How Can We Answer the Really BIG Questions? (NASA JPL)
- Lessons Learned Migrating Space Operational Systems to the Cloud on AWS (Lockheed Martin)
- Earth is Just Our Starting Place: Blue Origin and the Future of Space Technology (Blue Origin)



Earth and Space on AWS

# Processing and Streaming GOES-16 Data with AWS Managed Services

Element 84

Dan Pilone

CTO - Element 84, Inc.

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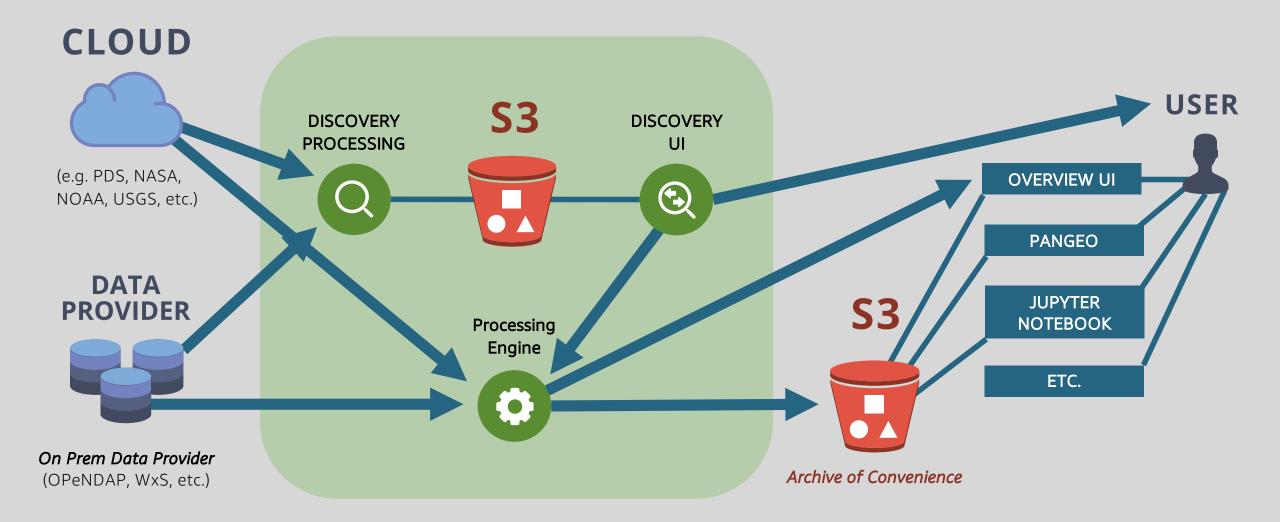
# Element 84

- We leveraged AWS EC2/Spot/ECS and ETS to make ~20 TBs of AWS Public Dataset GOES-16 imagery visually navigable at varying levels of bandwidth.
- We can apply this approach to lots and lots of data products
- We've leveraged AWS Batch (ECS & Spot) to parallelize creation of data bundles into ephemeral Archives of Convenience
- Users get convenient, highly elastic access to data that suits their needs, in their preferred format.
- All of this costs \$0 when not in active use but scales horizontally as big as budget allows.

Demo @ https://labs.element84.com/index.html



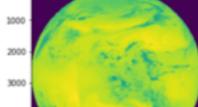
# Overall Data Flow







💭 jupyte	goes16 Last Checkpoint: Last Tuesday at 3:33 PM (autosaved)	4	Logout	
File Edit	View Insert Cell Kernel Widgets Help	Trusted	Python 2 O	
B + X	2 16 1 1 H Run 🔳 C 🗭 Markdown 💠 🖽			
	Working with cloud-based Zarr files			
	Connecting to S3			
	Because Zarr loads datasets by chunks, we can keep most of the data on \$3, and only pull down the pieces we want:			
In [1]:	import s3fs import zarr			
	<pre>s3 = s3fs.S3FileSystem(profile_name='rd', client_kwargs=dict(region_name='us-east-1')) store = s3fs.S3Map(root='e84-goes/dan/test.zarr', s3=s3, check=False) big_zarr = zarr.group(store=store)</pre>			
In [2]:	<pre>print big_zarr.keys()</pre>			
	['2017-12-31T06:11:24.6Z', '2017-12-31T06:26:24.6Z', '2017-12-31T06:41:24.2Z', '2017-12-31T06:5	6:24.42']		
	This dataset is only four frames, but already is 1.5GB. For a video of non-trivial size, zarr allows us to only pull the pieces of the o downloading the entire group.	datasets we need, w	ithout	
In [3]:	<pre>imatplotlib inline</pre>			
In [5]:	import matplotlib.pyplot as plt			
	<pre>import time start_time = time.time()</pre>			
	<pre># Plot only the "lower-level water vapor" infrared band for a specific frame in a larger datase band10 = big_zarr['2017-12-31T06:26:24.6Z']['CMI_C10'][:] plt.imshow(band10)</pre>	e		
Out[5]:	<matplotlib.image.axesimage 0x121d7ce10="" at=""></matplotlib.image.axesimage>			
	2000 -			





# Machine Learning with Earth Observation Imagery

NaNa Yi

Engineer, Development Seed

Marc M Fagan

CEO, EOS Data Analytics

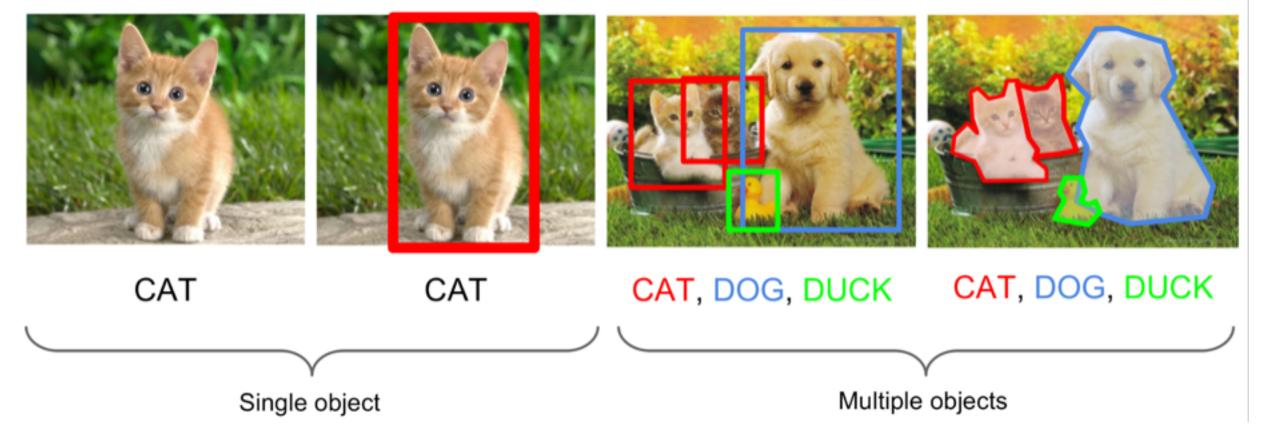
© 2018, Amazon Web Services, Inc. or its affiliates. All rights reserved.

### Classification

### Classification + Localization

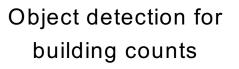
### **Object Detection**

#### Instance Segmentation

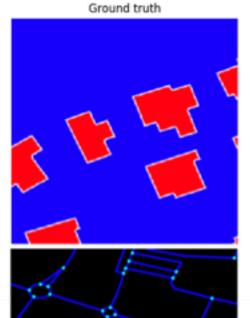


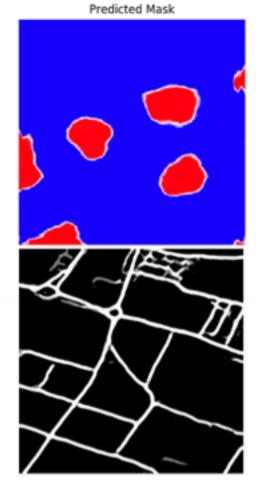


# Segmentation for detecting building footprint and road network



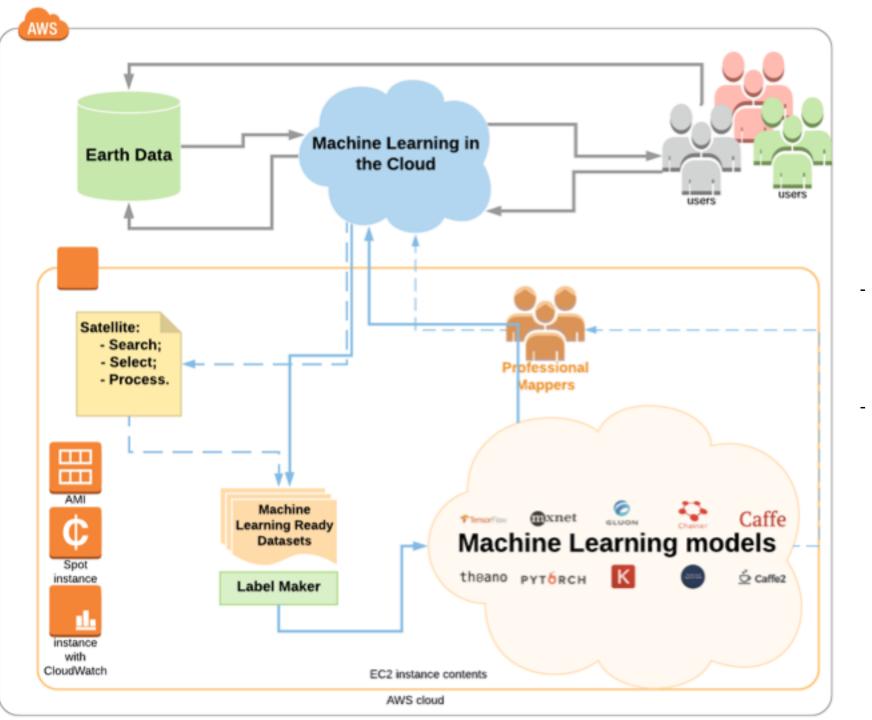












**'Fully automated'** machine learning pipeline;

#### Semi-automated machine

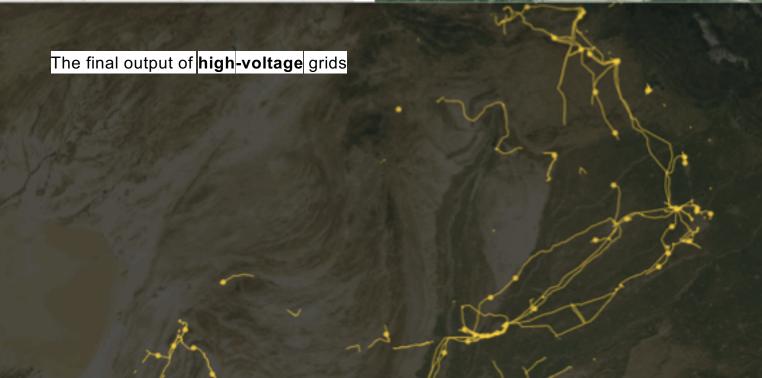
learning that will require our professional mappers' QA and mapping objects.





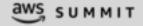


Machine learning outputs











### "100% Convolutional Neural Network" Disclaimer – lots of human "training or Indexing"

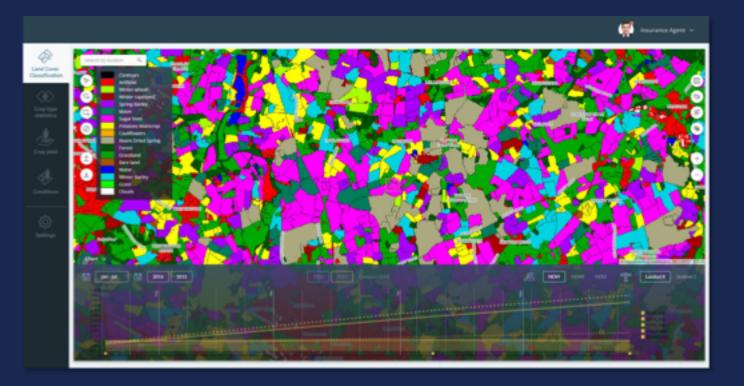
### "100% Amazon"

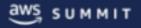
Disclaimer – sometimes "fool around" with on-premise Gaming GPUs

# All production - Storage, CPU, GPU, Products up on AWS

# InSAR Weekly Ag Crop Production - United States

- Bloomberg first –of-its-kind financial industries data for commodities, futures, derivatives, swaps trading
- Producers– seed , manufactures, logistics, storage, food processors, etc.
- Governments and nonprofit





### Running models and HPC

2

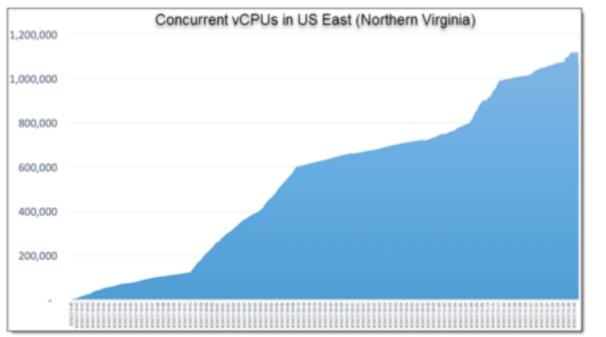


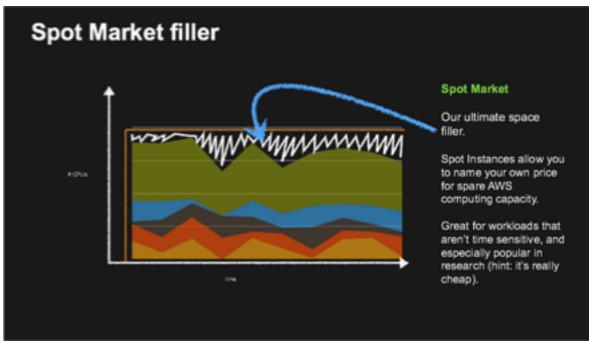
### **HPC Workloads in the Cloud**



#### Elasticity: Natural Language Processing at Clemson University

#### 550,000 cores & EC2 Spot Instances







*"I am absolutely thrilled with the outcome of this experiment. The graduate students on the project* [...] *used resources from AWS and Omnibond and developed a new software infrastructure to perform research at a scale and time-to-completion not possible with only campus resources."* – Prof. Amy Apon, Co-Director of the Complex Systems, Analytics and Visualization Institute

https://aws.amazon.com/blogs/aws/natural-language-processing-at-clemson-university-1-1-million-vcpusec2-spot-instances/

#### Elasti

# YESTĒRDAY – 1M cores

55 Univa Demonstrates Extreme Scale Automation by
Deploying More Than One Million Cores in a Single
Univa Grid Engine Cluster using AWS

🕓 June 24, 2018 🛛 🚨 Cameron Brunner, Director of Engineering, Univa

400,000

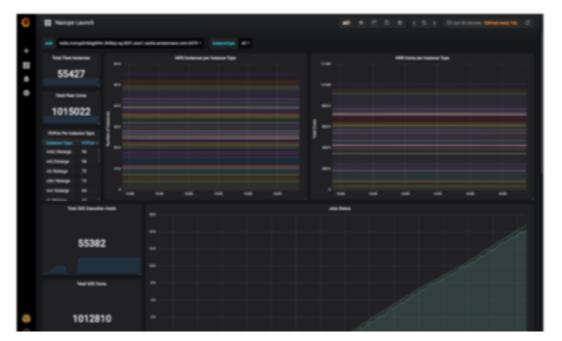
200,000

httr

600,000

800,000

To demonstrate the unique ability to run very large enterprise HPC clusters and workloads, Univa leveraged AWS to deploy 1,015,022 cores in a single Univa Grid Engine cluster to showcase the advantages of running large-scale electronic design automation (EDA) workloads in the cloud. The cluster was built in approximately 2.5 hours using Navops Launch automation and comprised more than 55,000 AWS instances in 3 availability zones, 16 different instance types and leveraged AWS Spot Fleet technology to



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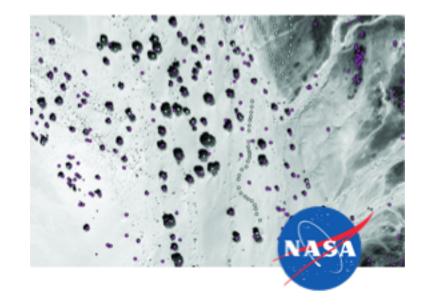
https://blogs.univa.com/2018/06/univa-demonstrates-extreme-scale-automation-bv-deploving-more-than-one-million-cores-in-a-single-univa-grid-engine-cluster-using-aws/

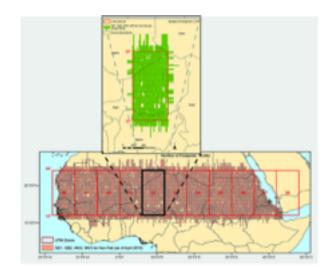
#### **NASA – Climate Research**

- Mosaicking 2,500+ QuickBird satellite images into 100-kilometer (km) x 100-km tiles, which are then broken into 25-km x 25-km sub-tiles for processing.
- Orthorectifying and mosaicking all satellite data in ADAPT
- Identifying trees and shrubs using adaptive vegetation classifier algorithms. Estimating biomass. Incorporating algorithms to calculate tree and shrub height for biomass estimates.

The combined resources of ADAPT and AWS potentially reduce total processing time from 10 months to less than 1 month

Source: https://www.nas.nasa.gov/SC15/demos/demo31.html





#### Accelerators (GPU/FPGA) for HCLS: Children's Hospital of Philadelphia

#### The fastest ever analysis of 1000 genomes

- 1,000 pediatric whole genomes
- Average 40X coverage
- Max 60X coverage
- Total runtime 2h 25min
- 1000 FPGA instances





#### ... Available in "AWS App Store" for ~\$24 / genome



Welcome to the WRF in the Cloud Mini-tutorial for the 2018 Joint WRF and MPAS Workshop. This tutorial will introduce the steps for running WRF in the cloud, using an Amazon Web Services (AWS) platform.

Click on a tab below for quick navigation.



http://www2.mmm.ucar.edu/wrf/OnLineTutorial/wrf in o



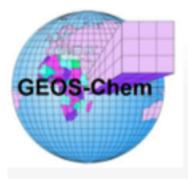


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http://www2.mmm.ucar.edu/wrf/OnLineTutorial/wrf in cloud aws tutorial.php



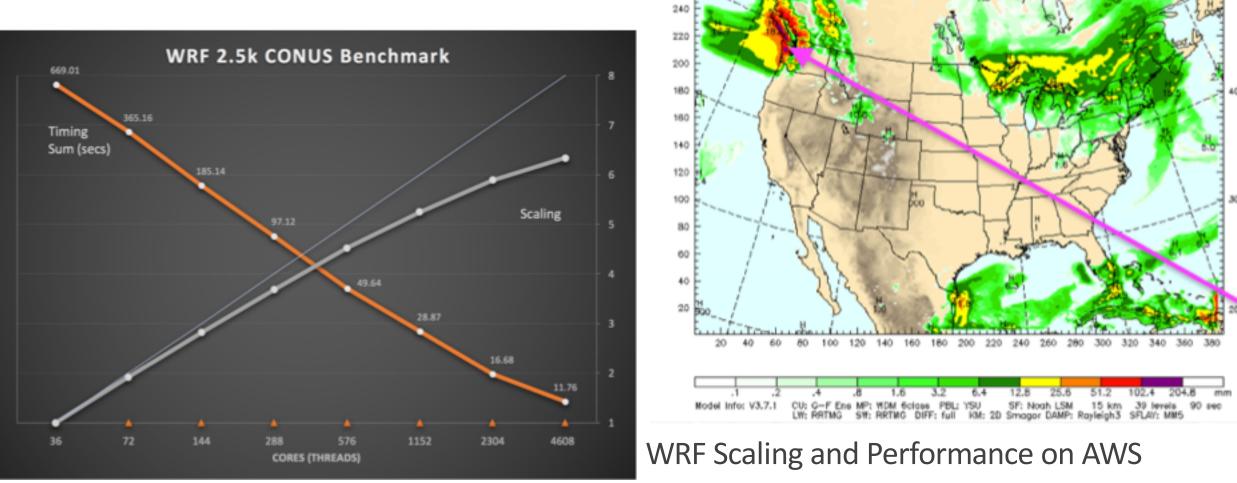
#### Step 2: Launch a server with GEOS-Chem pre-installed

Log in to AWS console, and click on EC2 (Elastic Compute Cloud), which is the most basic cloud computing service.

AWS services

http://cloud-gc.readthedocs.io/en/latest/chapter02\_beginner-tutorial/quick-start.html#quick-start-label

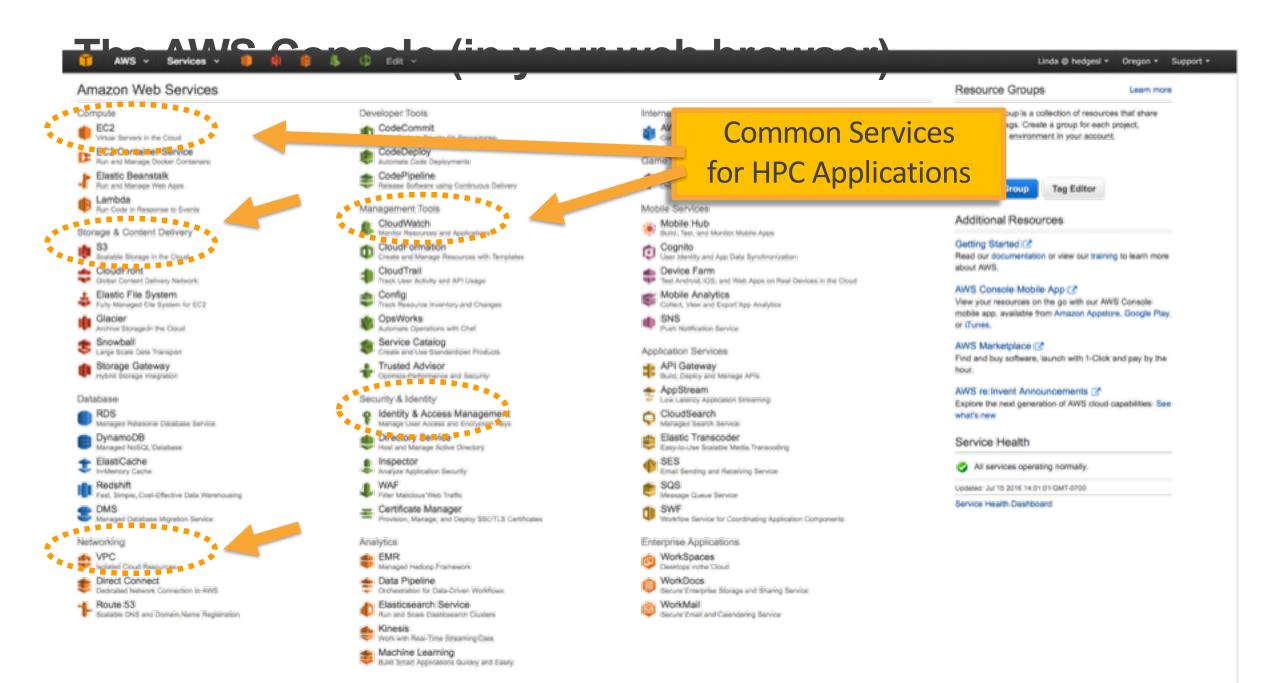
### **WRF Weather Prediction**



130

70 M

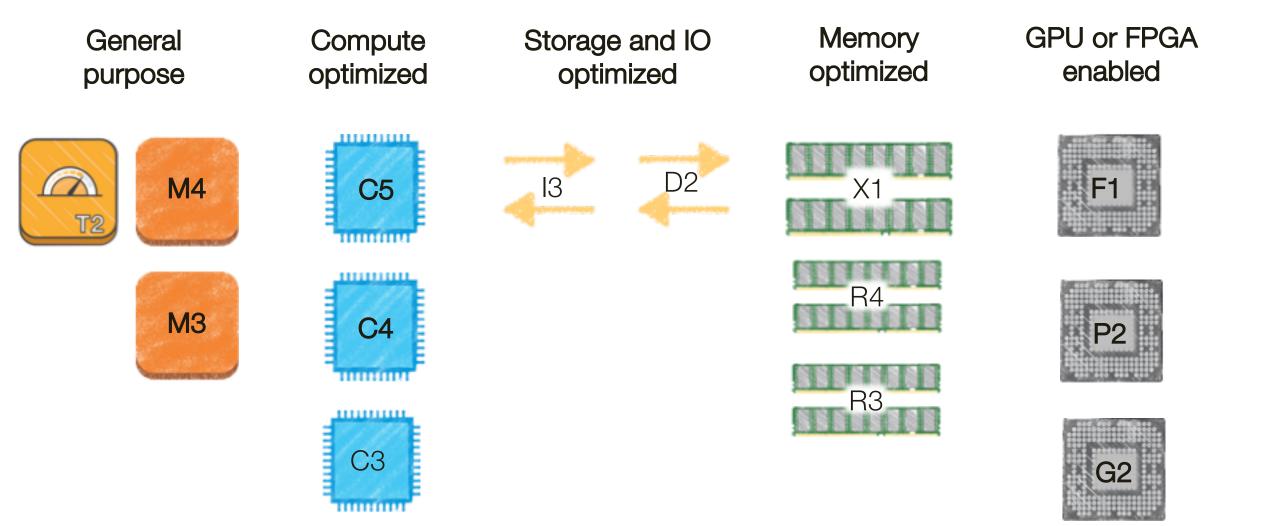
Weather and climate models are popular workloads on AWS: Researchers, businesses (The Weather Channel), financial sector, ...



# **Basics** Compute



### **Spectrum of Compute Instance Types**



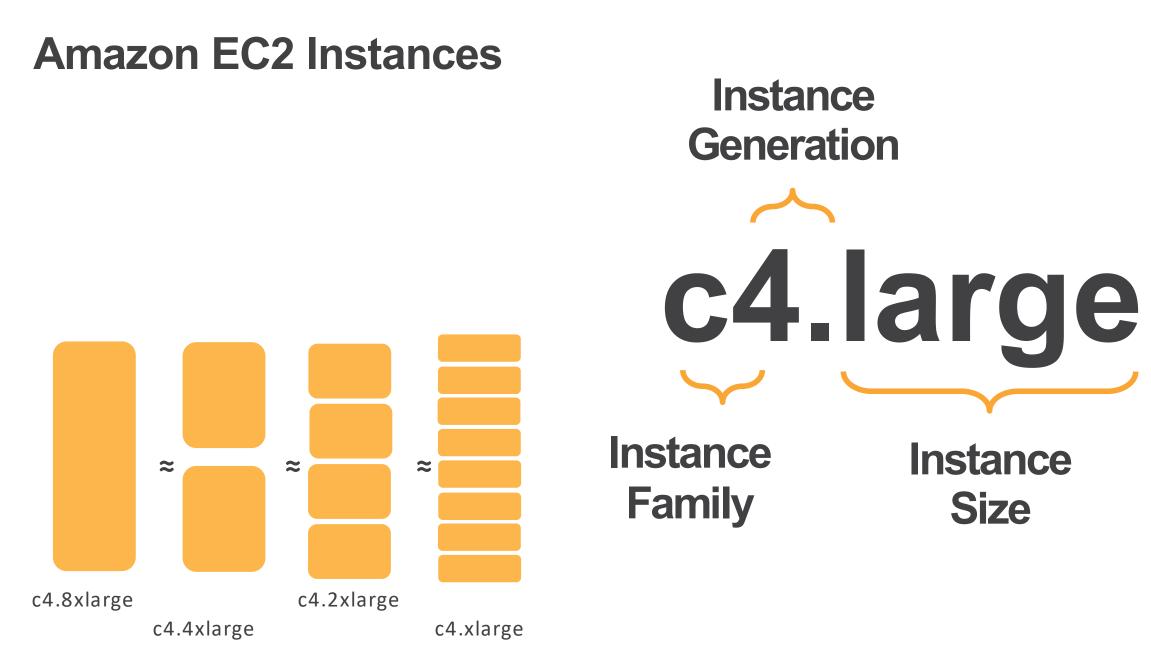
### **Selecting an instance type**

Instance Type	vCPU	Memory (GiB)	Storage (GB)	Networking Performance	Physical Processor	Clock Speed (GHz)	EBS Opt
c4.8xlarge	36	60	EBS Only	10 Gigabit	Intel Xeon E5-2666 v3	2.9	Yes
c3.8xlarge	32	60	2 x 320 SSD	10 Gigabit	Intel Xeon E5-2680 v2	2.8	No
m4.10xlarge	40	160	EBS Only	10 Gigabit	Intel Xeon E5-2676 v3	2.4	Yes
m4.16xlarge	64	256	EBS Only	20 Gigabit	Intel Xeon E5-2686 v4	2.3	Yes
p2.16xlarge	64	732	EBS Only	20 Gigabit	Intel Xeon E5-2686 v4	2.3	Yes
x1.32xlarge	128	1,952	2 x 1,920 SSD	20 Gigabit	Intel Xeon E7-8880 v3	2.3	Yes
r3.8xlarge	32	244	2 x 320 SSD	10 Gigabit	Intel Xeon E5-2670 v2	2.5	No

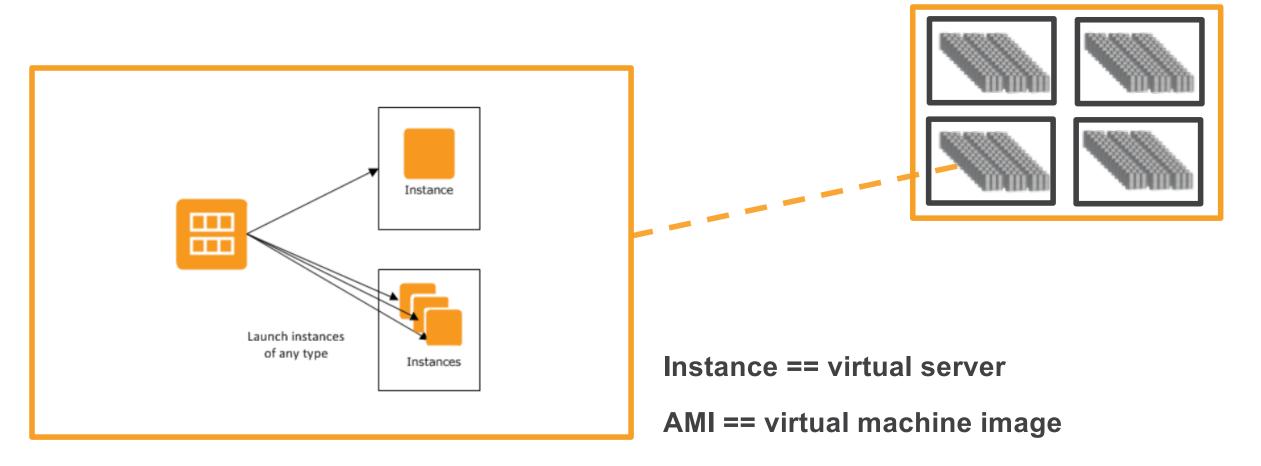
CAREFUL: a "vCPU" is a hyperthread, i.e. ½ of a physical core.

C4.8xlarge has 36 vCPU but 18 physical cores, the way HPC practitioners usually count them.

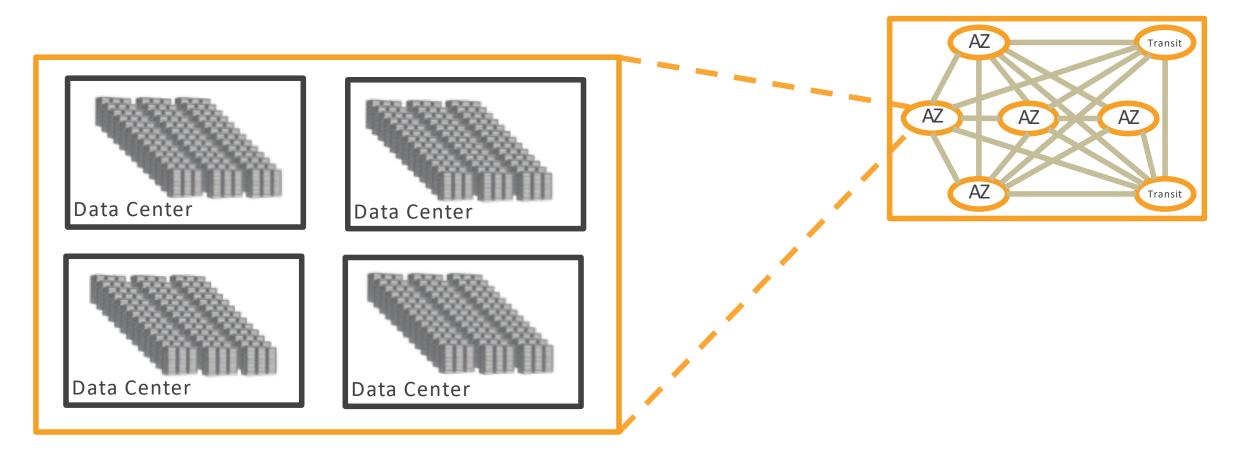
https://aws.amazon.com/ec2/instance-types/#instance-type-matrix

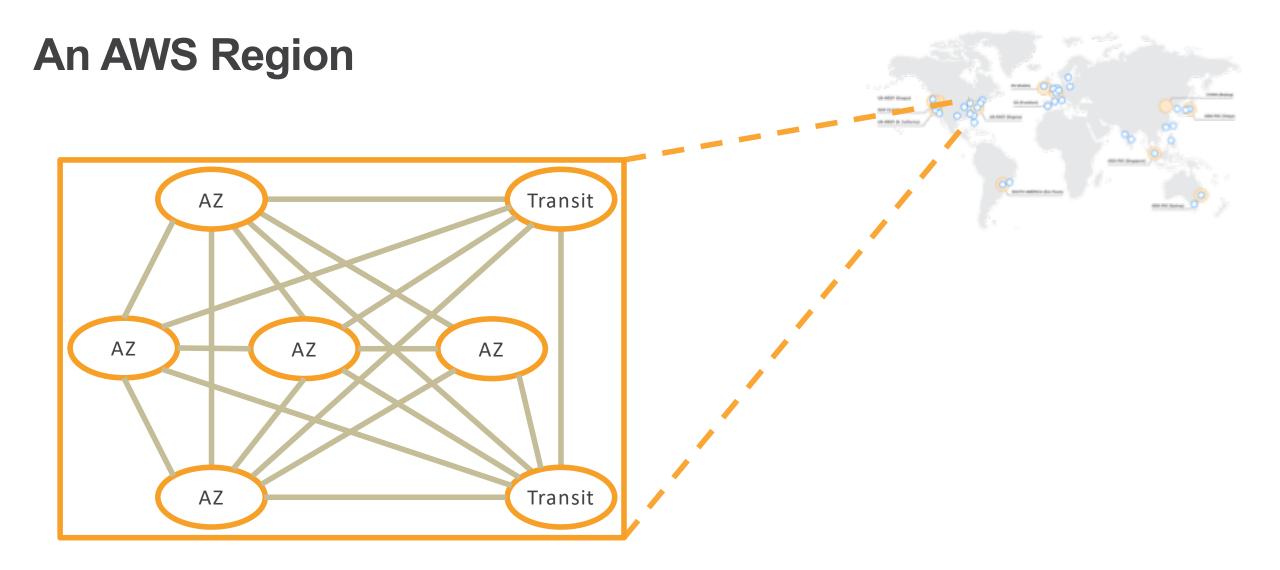


### Launching an Instance from an AWS Machine Images (AMI)



# An AWS Availability Zone





## **The AWS Global Infrastructure**



# Basics Storage

# **AWS Storage Options for HPC Workloads**

### EFS

Highly available, multi-AZ, fully managed networkattached elastic file system.

For near-line, highlyavailable storage of files in a traditional NFS format (NFSv4).

Use for read-often, temporary working storage

## EC2+EBS

Block storage device (SSD or HDD) for file system attached to EC2 instance. Can build parallel file system (e.g., using Intel Lustre).

For near-line storage of files optimized for high I/O performance. Amazon S3

Secure, durable, highly-scalable object storage. Fast access, low cost.

For long-term durable storage of data, in a readily accessible get/put access format. **Amazon Glacier** 

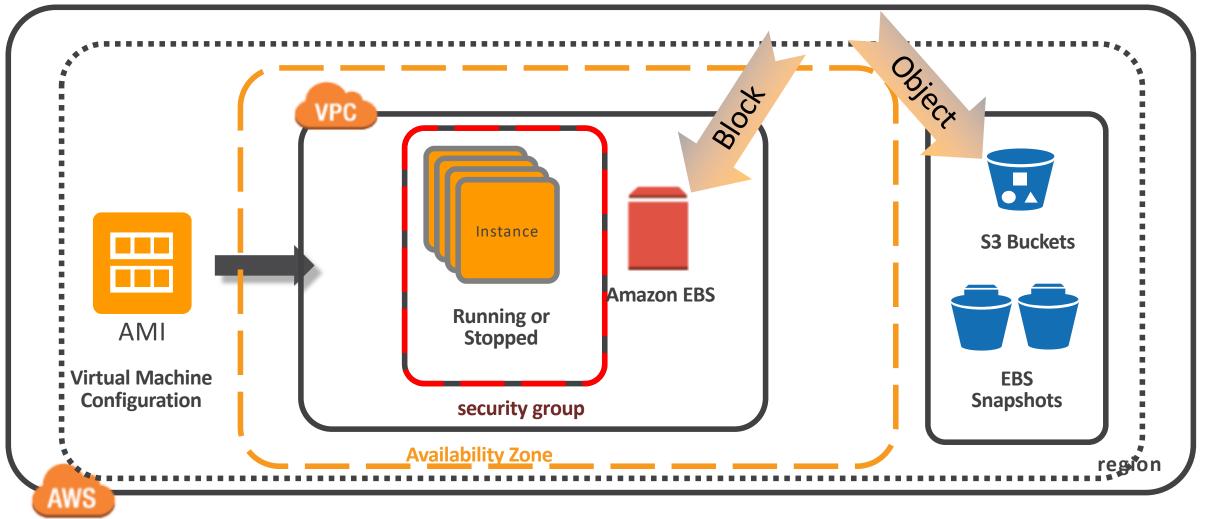
Secure, durable, long term, highly costeffective object storage.

For long-term storage and archival of data that is infrequently accessed.

Use for high-IOPs, temporary working storage Primary durable and scalable storage for HPC data Use for long-term, lower-cost archival of HPC data

# **Combining Compute and Storage**

AWS cloud



# **Basics** Network

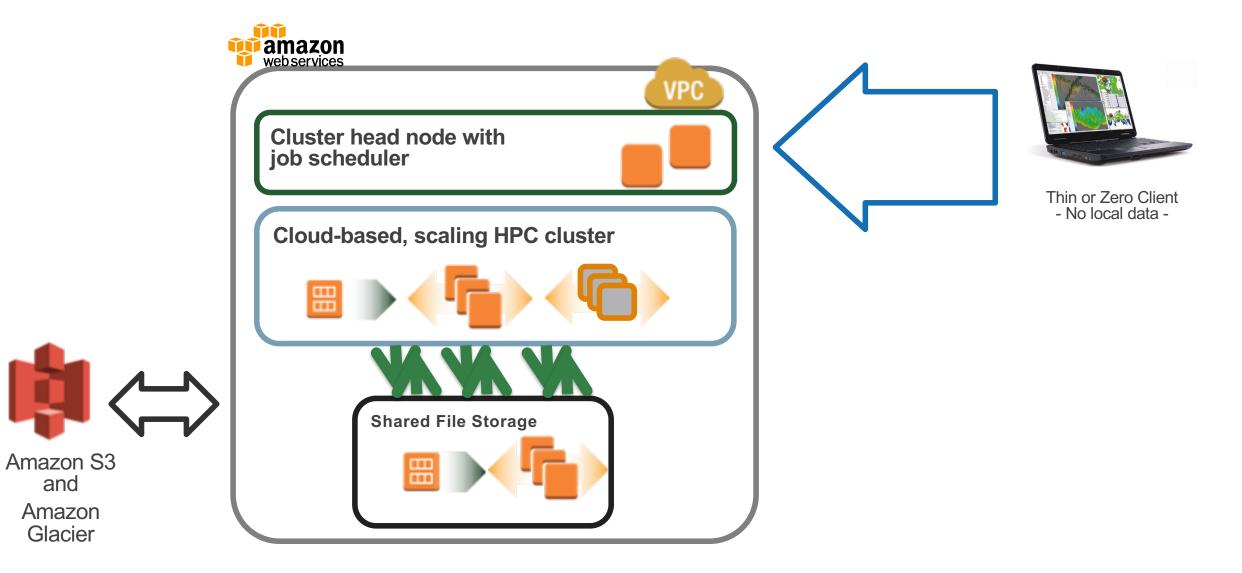


# We can build a cluster:





## Using a compute cluster in the cloud



# Using a compute cluster in the cloud

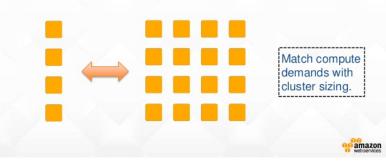
Self-scaling HPC clusters instantly ready to compute, billed by the hour and use the AWS Spot market by default, so they're very low cost



- Popular scientific applications prepackaged
- Deploys in ~5 minutes.
- Familiar job schedulers, scientific applications, and shared file system.
- Install any software you need.
- No job queues it's your personal cluster.
- Access to the graphical console.
- Deploys in minutes.
- Scales as large as needed when you add jobs to the queue, and scales back down when the jobs are done.

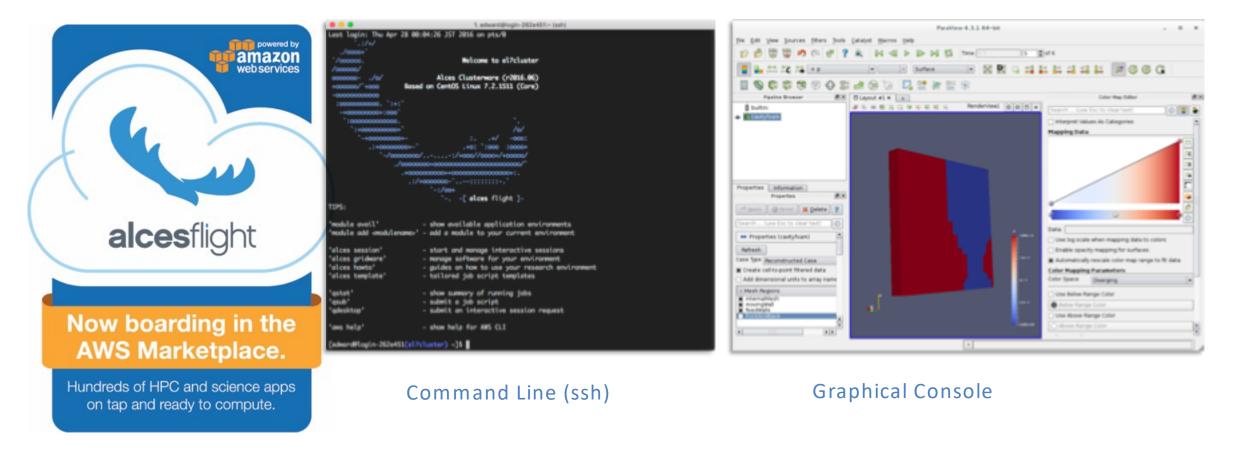
## Resizable clusters

Easy to add and remove compute capacity on your cluster



# Using a compute cluster in the cloud

Self-scaling HPC clusters instantly ready to compute, billed by the hour and use the AWS Spot market by default, so they're very low cost



# **Controlling your AWS resources**

• 1. Web browser (point-and-click)

Launch Ins	tance 👻	Connect Act	ions 🛩						
Q. Filter by tags and attributes or search by keyword									
Name	-	Instance ID	Instance Type	Availability Zone -	Instance State ~	Status Checks ~	Alarm Status	Public DNS (IPv4)	
		i-017627916a95ba3	of.8kiarge	us-west-1c	running	2/2 checks	None 🏷	ec2-54-183-78-22 us-west-1 compute amazonaws.com	
🗍 wt_in	_cloud	i-07c1485ab92bf2ece	o4.8kiarge	us-west-1c	🥥 terminated		None 🍃	1	
		i-0a20a2973824afb1d	o4.8xlarge	us-west-1c	🥥 terminated		None 🍡	1	
		1 Anna 76 880076 da a AA	of Bulance	the second file	A series	<ul> <li>30 shools</li> </ul>	None Sec.	447 87 87 88 887 - a cost 5 second a second second	

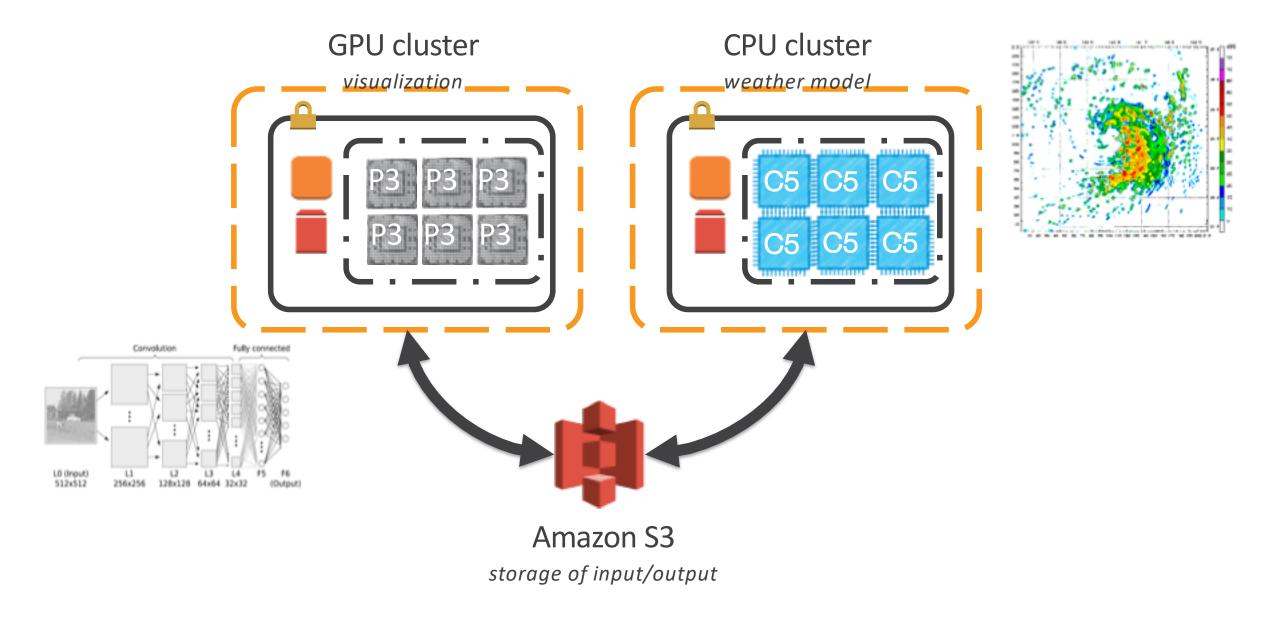
• 2. Command-line interface (script, automate)

~\$ aws s3 cp myvideo.mp4 s3://mybucket/

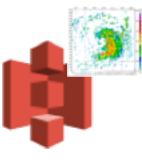
https://aws.amazon.com/cli/

• 3. SDKs (GUIs, platforms, science gateways)

# **Compute clusters in the cloud are fit for purpose**

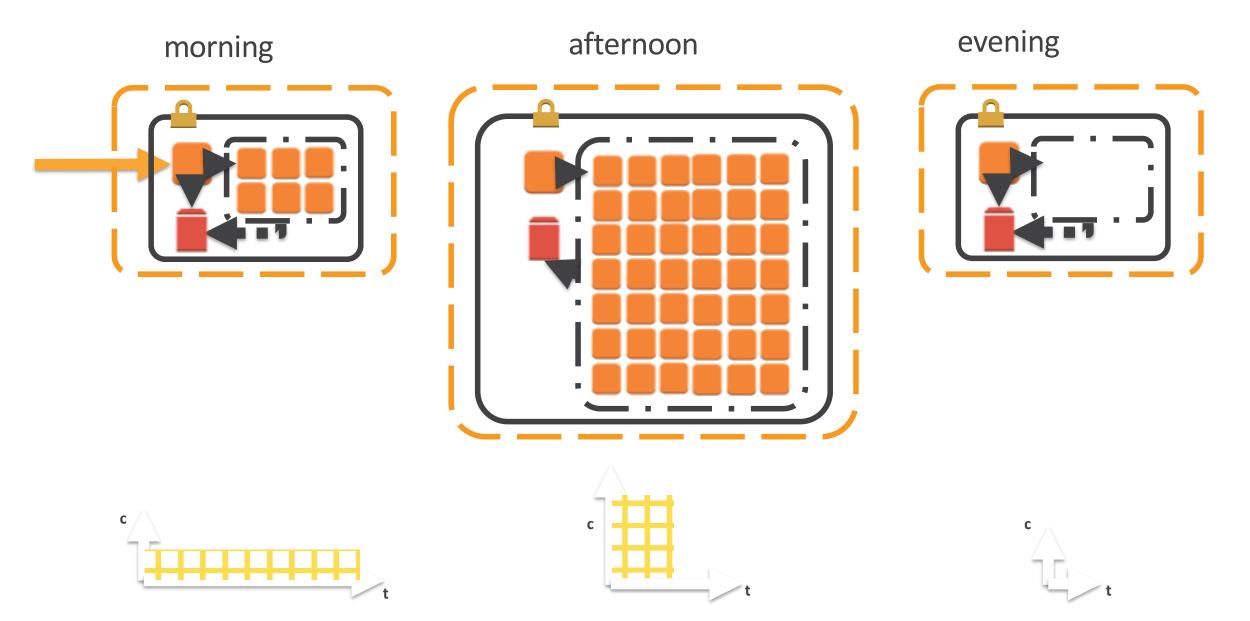


## **Compute clusters in the cloud are ephemeral**

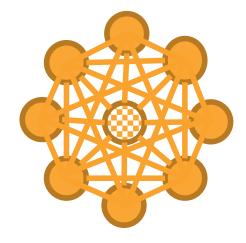


## Amazon S3 storage of input/output

# **Compute clusters in the cloud are elastic**



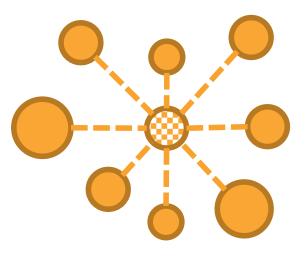
# Tightly and loosely coupled workloads



## **Cluster HPC**

Tightly coupled, latency sensitive applications

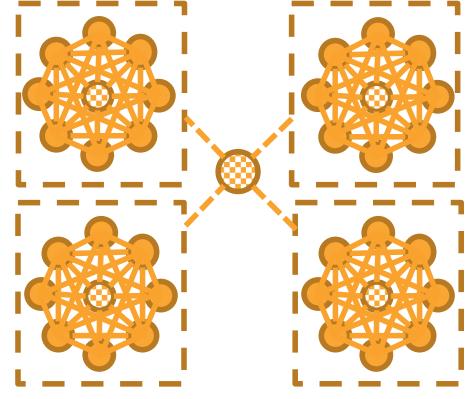
Use larger EC2 compute instances, placement groups, enhanced networking



## **Grid HPC**

Loosely coupled, HTC, pleasingly parallel

Use a variety of EC2 instances, multiple AZs, Spot, Auto Scaling, Amazon SQS

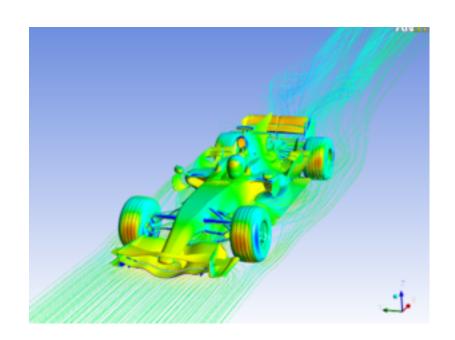


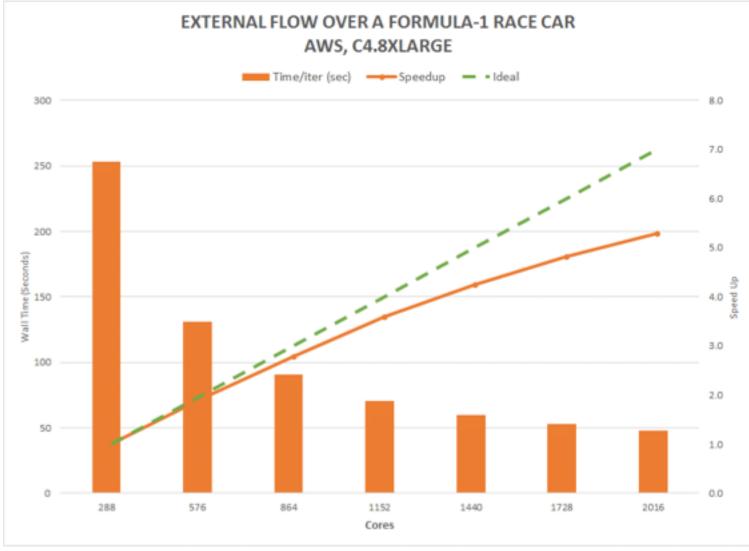
## **Ensemble?**

Run all members at once!

## **Performance for Fluid Dynamics on AWS** ANSYS Fluent

- AWS c4.8xlarge
- 140M cells
- F1 car CFD benchmark





http://www.ansys-blog.com/simulation-on-the-cloud/



# **Data Lakes and Collaboration**

3



# Collaborating on scientific data in the cloud

It's typically time-consuming and expensive to acquire, store, and analyze large data sets. Sharing data on AWS makes it accessible to a large and growing community of researchers who use the AWS cloud.

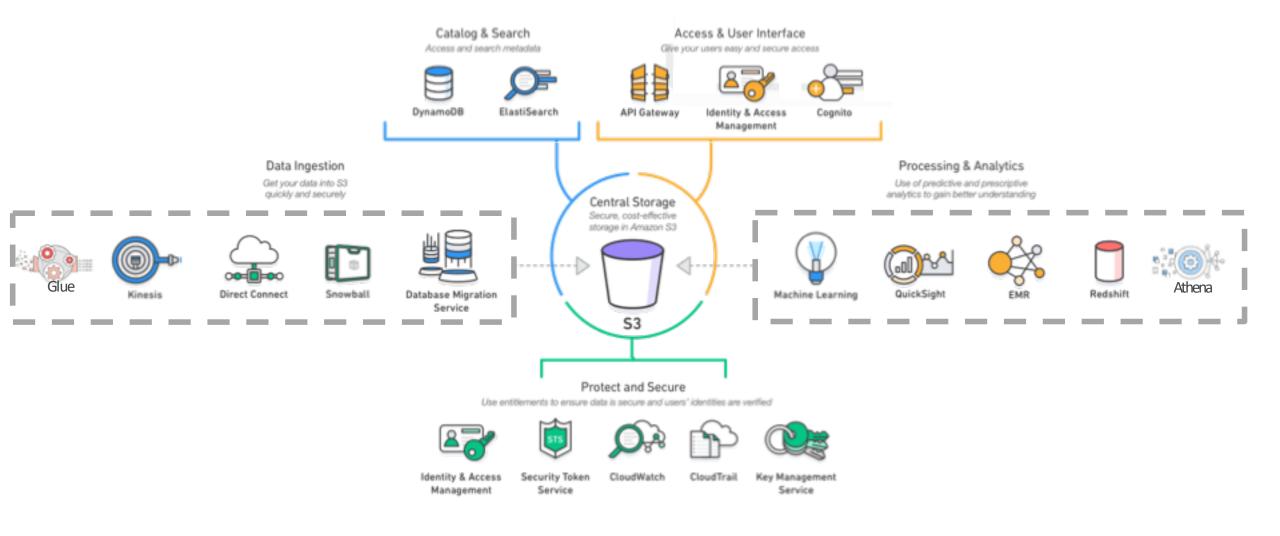
- AWS is built from the ground up with sophisticated, real-world security: share without giving up security.
- Use AWS worldwide network and data centers to reach your collaborators.
- Collaborators can analyze your shared data in their own account, and run your shared applications in their own account, at their own expense.
- Not necessary for everyone to download a copy of the dataset: everyone can bring analytics to central copy.
- You retain full ownership. Data never leaves a country ("data residency") unless you explicitly move it.

## **Global Platform for Global Collaboration**



## Bring the users and compute to the data; don't send the data to the users.

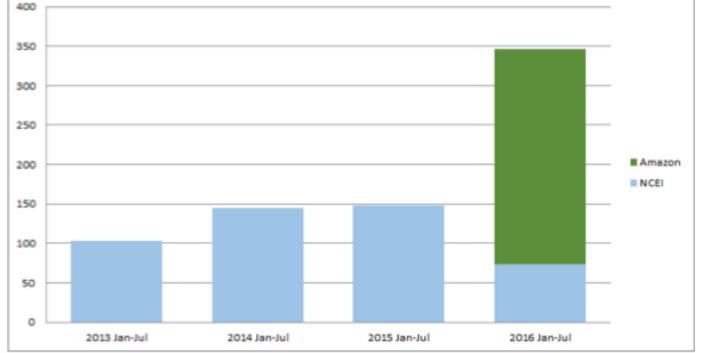
## Collaborating on scientific data in the cloud



## Collaborating on scientific data in the cloud



## NOAA- NEXRAD on AWS S3, usage increased 2.3



## **Public Datasets on AWS**

To stimulate innovation, AWS hosts a selection of datasets that anyone can access for free. Data in our public datasets is available for rapid access to our flexible and low-cost computing resources.



## Life Science

- TCGA & ICGC (used at OICR)
- 1000 Genomes
- Genome in a Bottle
- Human Microbiome Project
- 3000 Rice Genome



## **Earth Science**

- Landsat
- NEXRAD
- NASA NEX



## **Internet Science**

- Common Crawl Corpus
- Google Books Ngrams
- Multimedia Commons

# Collaborating on scientific data in the cloud

AWS hosts a selection of public datasets that anyone can access for free.

# Earth on AWS

Build planetary-scale applications in the cloud with open geospatial data.

ans.amazon.com/aarth https://registry.opendata.ans

Climate Models

magery

Elevation Models

Satellite Imagery

High-resolution Radar Badar Sbjt Sun 18:442 14-Ma

OODLEAF

CLEVEL AN

ENOCHVILLE

KANNAPOLIS

Caberanerus

# **Registry of Open Data on AWS (RODA)**

### **Registry of Open Data on AWS**

## aws

### About

This registry exists to help people discover and share datasets that are available via AWS resources. Learn more about sharing data on AWS.

See all usage examples for datasets listed in this registry.

### Search datasets (currently 59 matching datasets)

Search datasets

### Add to this registry

If you want to add a dataset or example of how to use a dataset to this registry, please follow the instructions on the Registry of Open Data on AWS GitHub repository.

Unless specifically stated in the applicable dataset documentation, datasets available through the Registry of Open Data on AWS are not provided and maintained by AWS. Datasets are provided and maintained by a variety of third parties under a variety of licenses. Please check dataset licenses and related documentation to determine if a dataset may be used for your application.

### Sentinel-2

#### earth observation satellite imagery gis natural resource sustainability

The Sentinel-2 mission is a land monitoring constellation of two satellites that provide high resolution optical imagery and provide continuity for the current SPOT and Landsat missions. The mission provides a global coverage of the Earth's land surface every 5 days, making the data of great use in on-going studies. L1C data are available from June 2015 globally. L2A data are available from April 2017 over wider Europe region, planned to be expanded globally in July 2018.

#### Details -+

#### Usage examples

- Sterling Geo Using Sentinel-2 on Amazon Web Services to Create NDVI by Sterling Geo
- Satellite Search by Remote Pixel by Remote Pixel
- Sentinel Hub WM5/WMT5/WCS Service by Sinergise
- Spectator tracking Sentinel 2, accessing the data and quick preview by Spectator
- Sentinel Playground by Sinergise

See 15 usage examples +

### Landsat 8

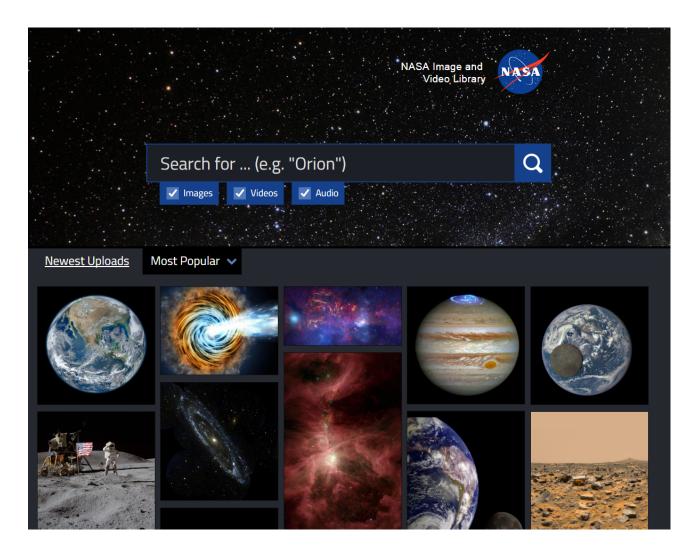
earth observation satellite imagery gis natural resource sustainability

An ongoing collection of satellite imagery of all land on Earth produced by the Landsat 8 satellite.

Details -+

### https://registrv.opendata.aws

## **NASA** Image and Video Library (2017)



• Easy Access to the Wonders of Space. Fully compliant with Section 508 of the Rehabilitation Act.

• Built-in Scalability. "On-demand scalability will be invaluable for events such as the solar eclipse that's happening later this summer both as we upload new media and as the public comes to view that content," says Bryan Walls, Imagery Experts Deputy Program Manager at NASA.

• Good Use of Taxpayer Dollars. By building its Image and Video Library in the cloud, NASA avoided the costs associated with deploying and maintaining server and storage hardware in-house. Instead, the agency can simply pay for the AWS resources it uses at any given time.

https://aws.amazon.com/partners/success/nasa-image-library/

## U.K. Met Office Uses AWS to Deliver Tailored Meteorological Data

"We are using the AWS Cloud to drive the mass-market availability of customizable weather information.

James Tomkins Head of Enterprise IT Architecture Met Office

## **Met Office**

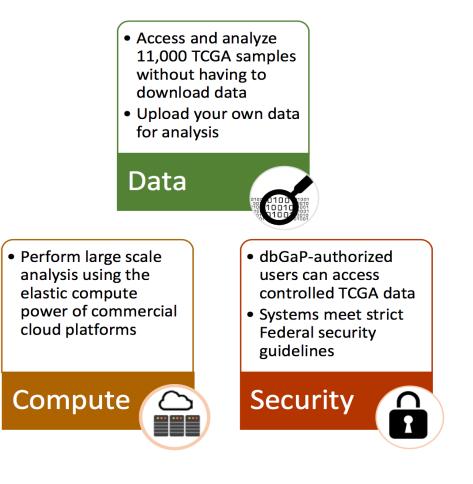
The Met Office has been a widely respected national weather service in the United Kingdom for 160 years.

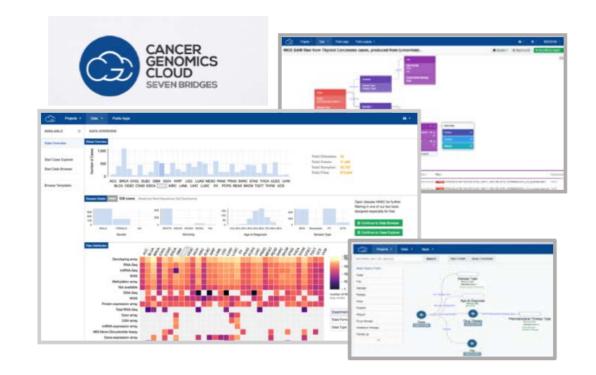
- Needed the means to send weather data to device users and third-party customers.
- Deployed Amazon ElastiCache to respond to peak demands.
- Attracted more than half a million users with its WeatherCloud app.
- Scaled data storage tenfold and reduced solution costs by 50 percent.
- Enabled innovation of big data services in a competitive landscape.

https://aws.amazon.com/solutions/case-studies/the-met-office/ https://aws.amazon.com/about-aws/whats-new/2017/08/uk-met-office-high-resolution-weather-forecast-data-is-now-on-aws/

## **NIH** initiatives: National Cancer Institute – Cloud Resources

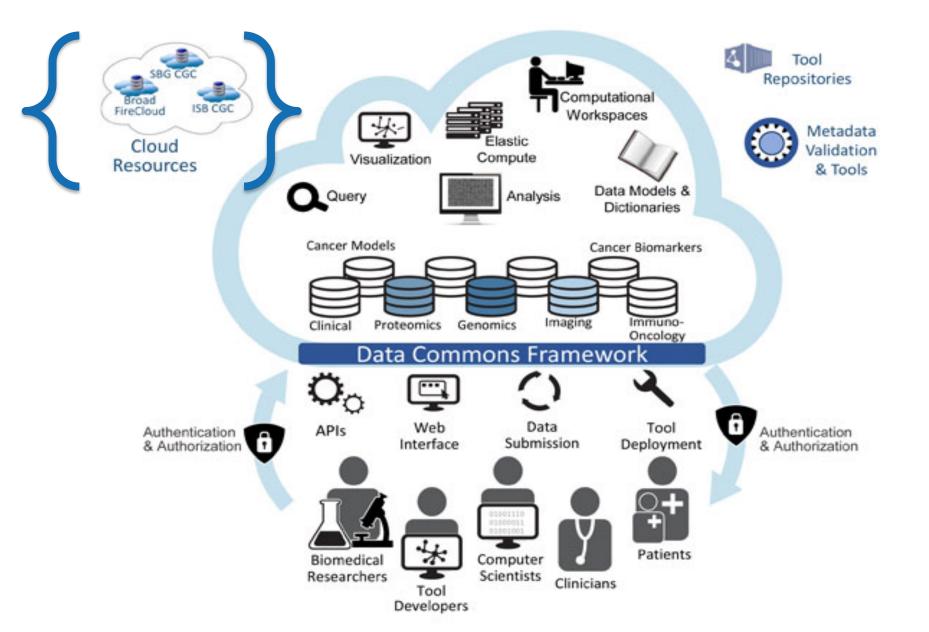
## Funded projects to create collaborative environments on cloud



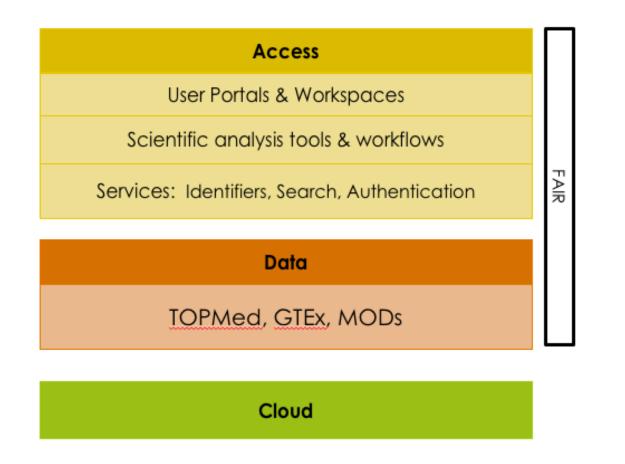


### http://www.cancergenomicscloud.org

## **NCI** Cancer Research Data Commons



## **NIH Data Commons Pilot**



- Create a research ecosystem
- Components include:
  - Computing environments (HPC, cloud)
  - Data with Common Digital Object ID's
  - Software for resource provisioning, data discovery, scientific applications and workflows

https://commonfund.nih.gov/bd2k/commons

## **Containers, AWS Batch, Microservices**

4





Physical

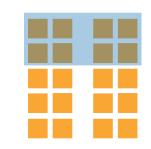
On-premise server

Virtualisation



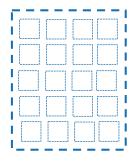
EC2 instance

### Containerization

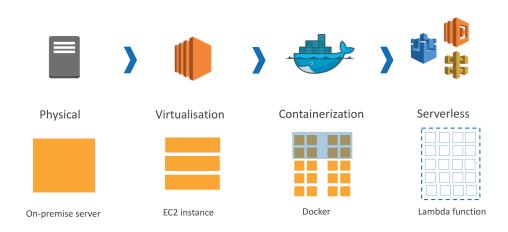


Docker

Serverless



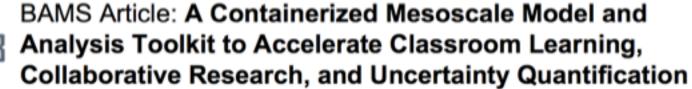
Lambda function



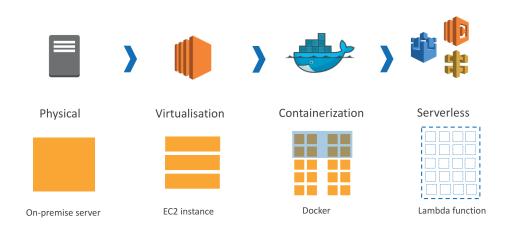


A Common and Sustainable Big Data Infrastructure in Support of Weather Prediction Research and Education in Universities

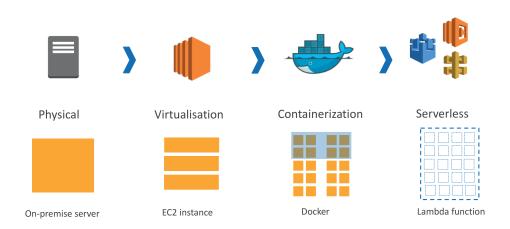
### http://bigweatherweb.org/Big\_Weather\_Web/Home/Home.html



Containerized WRF available! https://github.com/NCAR/container-wrf https://hub.docker.com/r/bigwxwrf/ncar-wrf/







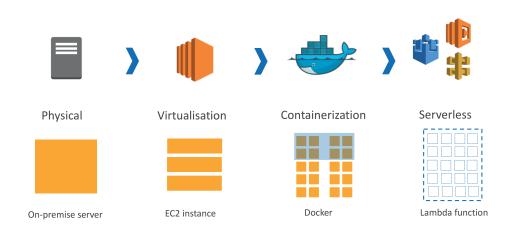
# AWS Batch – a managed service for container based jobs



**Container Based:** Each job is a Docker container with runtime parameters. Submit tens to millions of jobs to a queue, with priority and job dependency options.

**Fully Managed:** No software to install or servers to manage. AWS Batch provisions, manages, and scales the infrastructure needed to run the jobs.

**Cost optimization:** use spot instances or reserved instances to get the most research possible out of your research budget.



# **DNA Sequencing**

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- 14	. VV	-	LJ.	AI	- A
		-			

S3 & LAMBDA

AWS BATCH

;H



Send raw reads from

genome sequencers to AWS.



Lambda function responds to the arrival of data in S3 and submits AWS Batch jobs.



Using AWS Batch, configure resources and schedule when to run your secondary analysis workflow.



**BIG DATA** 

Complete your mapping, alignment, QC, and variant calling jobs based your AWS Batch configuration.



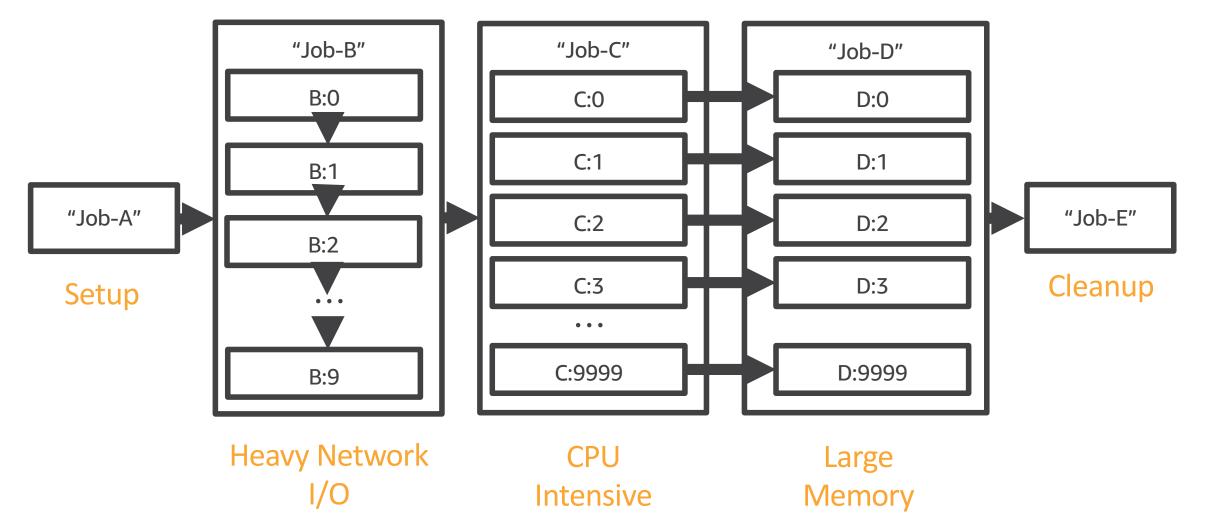
STORAGE



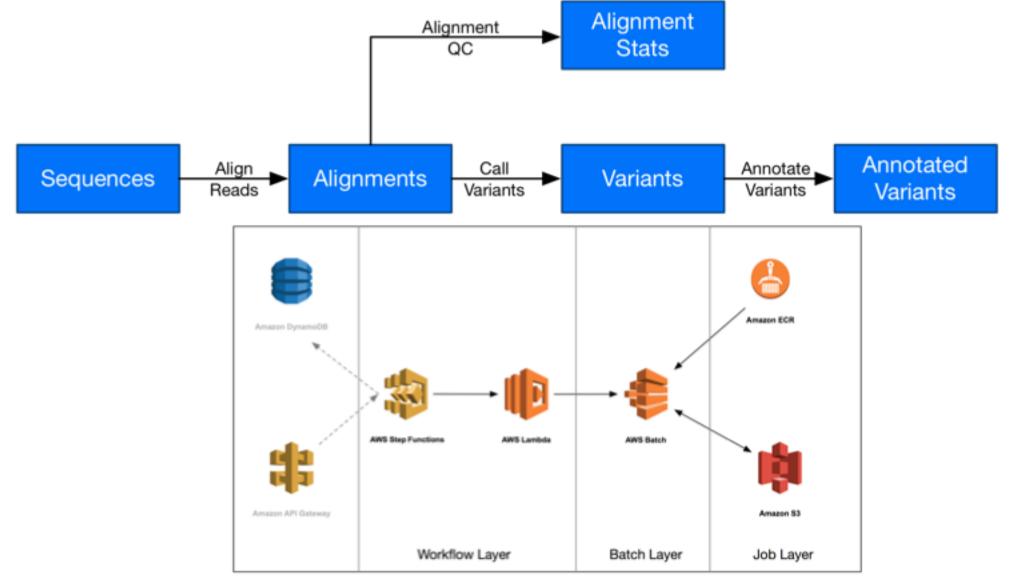
· · · · · · · · · · · · N

Archive results.





## **Building High-Throughput Genomics Batch Workflows on AWS**



https://aws.amazon.com/blogs/compute/building-high-throughput-genomics-batch-workflows-on-aws-introduction-part-1-of-4/

# **Serverless** Computing



## **Serverless Computing: AWS Lambda**

AWS Lambda is a service which allows for software functions in a variety of languages to be deployed into the cloud natively, and to be triggered directly or driven by events in the cloud. The infrastructure (hardware, operating system and software environment) for Lambda is managed by AWS and scales rapidly.



### Bring your own code

- Node.JS, Java, Python
- Java = Any JVM based language such as Scala, Clojure, etc.
- Bring your own libraries



Flexible invocation paths



## Simple resource model

- Select memory from 128MB to 1.5GB in 64MB steps
- CPU & Network allocated
   proportionately to RAM
- Reports actual usage



Fine grained permissions

## Two examples of HPC on Lambda

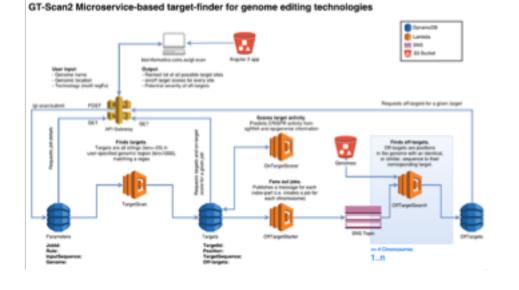
CSIRO have built quickly scaling genomics analysis on AWS Lambda



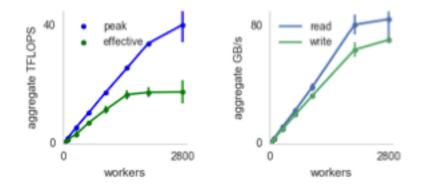
## PyWren.io

def my\_function(b): x = np.random.normal(0, b, 1024) A = np.random.normal(0, b, (1024, 1024)) return np.dot(A, x)

pwex = pywren.default\_executor()
res = pwex.map(my\_function, np.linspace(0.1, 100, 1000))



PyWren lets you run your existing python code at massive scale via AWS Lambda





## Pywren: Lambda in the context of Grid Computing

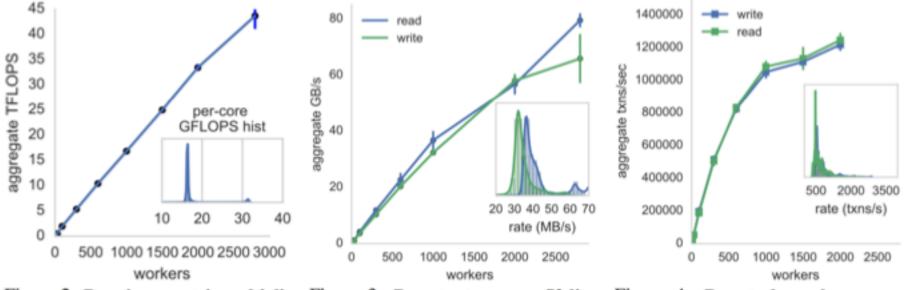


Figure 2: Running a matrix multiplication benchmark inside each worker, we see a linear scalability of FLOPs across 3000 workers.

Figure 3: Remote storage on S3 linearly scales with each worker getting around 30 MB/s bandwidth (inset histogram).

Figure 4: Remote key-value operations to Redis scales up to 1000 workers. Each worker gets around 700 synchronous transactions/sec.

Source: "Occupy the Cloud: Distributed Computing for the 99%" https://arxiv.org/pdf/1702.04024.pdf



Pywren democratizes parallel scaling capabilities that used to be the sole preserve of large super-computing centers. Tutorial: <a href="http://pywren.io/pages/gettingstarted.html">http://pywren.io/pages/gettingstarted.html</a> then <a href="http://github.com/pywren/examples/">http://github.com/pywren/examples/</a>

# **CSIRO – Cloud-based CRISPR prediction**

- CSIRO used AWS Lambda functions to completely re-engineer a cluster HPC workload to identify optimal gene editing sites for personalized treatment.
- "GTScan-2" job runtime varies from 1 second to 5 minutes, because the complexity of the targeted gene can vary dramatically.
- Rapid turn-around times are needed for real-time analysis.
- Server-based solutions can't be provisioned efficiently to handle the variability and quick turn-around – either you have lots of servers sitting idle, or you have to wait minutes for new servers to spin up.
- Re-casting of the code took only a few weeks



GT-Scan2

## **CSIRO – CRISPR search with AWS Lambda**

GT-Scan2.0 is implemented as a microservices architecture using AWS Lambda

Serverless:

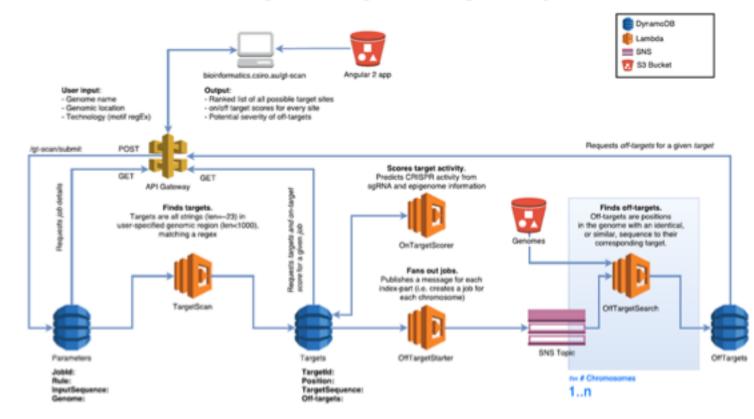
• Does not require users to have high-compute power

Scalable:

 Can be easily scaled to whole genome analysis

Also implement as a "stand-alone"

- Can be run on local servers
- Can incorporate your own ChIP-seq data rather than public data



GT-Scan2 Microservice-based target-finder for genome editing technologies

# Machine Learning and Amazon SageMaker

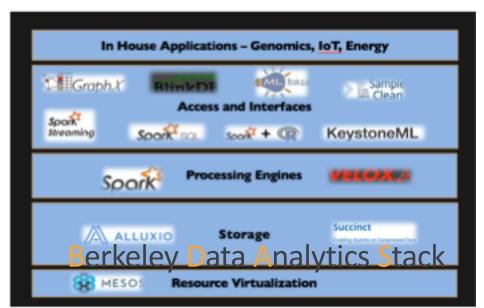


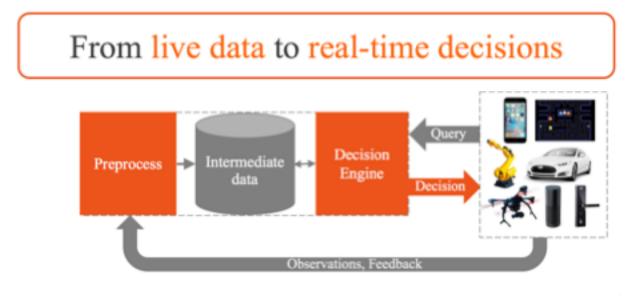
## **RISELab** (Real-time Intelligent Secure Execution)

Collaborative 5-year effort between UC Berkeley, National Science Foundation, and industry partners. (2017-2021) – AWS is founding partner. <u>https://riselab.cs.berkelev.edu</u>

- Students and researchers at RISELab use AWS to rapidly prototype and develop new systems at a scale and with a speed not possible before.
- Resulted in Apache Spark, developed on AWS, and integrated with AWS core services.

GOAL: Develop open source platforms, tools, and algorithms for intelligent real-time decisions on live-data





# **Deep Learning using clusters to improve accuracy**

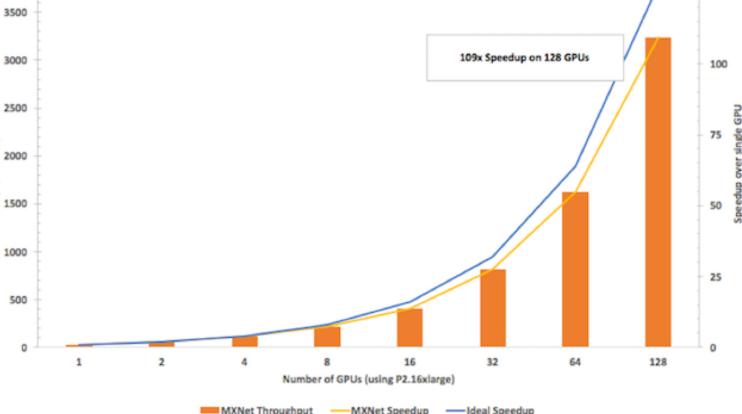
You can train a ML model on your laptop but ... 3500

In order to train a very ACCURATE model that can make real-world predictions that is publishable and cutting-edge ... You will need a much LARGER training dataset and training job that you can ONLY run on a cluster, possibly using GPU servers.

A job for EXPERTS?

 $\Rightarrow$  AMAZON SAGEMAKER

<go to SageMaker deck>



## **Research Cloud Program and Getting Started**



# **AWS Research Cloud Program**



## Science first, not servers.

Researchers are not professional IT people (nor do they wish to be).



## Simple and easily explained procedures to get set up with cloud access.



**Budget management** tools to ensure that over-spends do not happen.



**Best practices** to ensure both data and research budgets are safe and privacy is protected.

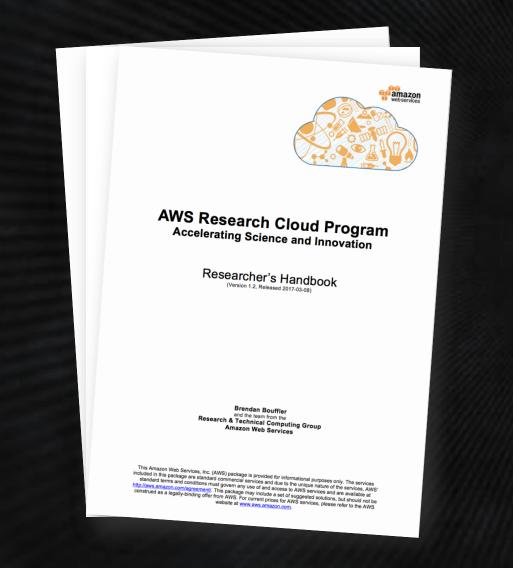


Fast track to invoice-backed billing & Egress Waiver.



Large catalog of scientific solutions from partners, including instant clusters from AWS Marketplace.

The 150-page "missing manual" for science in the cloud.



Written by Amazon's Research Computing community for scientists.

- Explains foundational concepts about how AWS can accelerate time-to-science in the cloud.
- Step-by-step best practices for securing your environment to ensure your research data is safe and your privacy is protected.
- Tools for budget management that will help you control your spending and limit costs (and preventing any over-runs).
- Catalogue of scientific solutions from partners chosen for their outstanding work with scientists.

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definitely saving money by actively monitoring jobs to catch problems early and reduce rework," explains Andrew McCottas. Engineering Manager at TLG. "We can also use it to reduce unnecessary cost in larger jobs that may otherwise run longer than required."

 https://www.top500.org/news/sponsored/why-customers-are-moving-highperformance-computing-workloads-to-amazon-web-services-1/

#### 1.3.7 Medical Imaging: National Database for Autism Research (NDAR)

Collaborative Big Data research. The National Institute of Mental Health Data Archive (NDA) makes research data available for reuse. Data collected across projects can be aggregated and made available, including clinical data, and the results of imaging, genomic, and other experimental data collected from the same participants. In this way, separate experiments on genotypes and brain volumes can inform the research community on the over one hundred thousand subjects now in the NDA.

The NDA holds rich datasets (fasts, brain imaging) in object-based storage (Amazon S3). It supports the deployment of packages (created through the NDA Query tools) to an Amazon Web Service Oracle database. The NDA envisions real-time computation against rich datasets that can be initiated without the need to download full packages. Furthermore, a new category of data structure has been created called "ovaluated data." This allows researchers using NDA cloud capabilities and computational pipelines to write any analyzed data directly back to the mNDAR database. Databases can also be populated with your own raw or evaluated data and uploaded directly back into the NDA for a streamlined data submission directly from a hosted database.

https://indar.nih.gov/cloud\_overview.html

#### 1.3.8 Genomics: GT-Scan2 from CSIRO in Australia

New HPC paradigms. In 2016, the Commonwealth Scientific and Industrial Research Organisation (CSIRO - a federal government agency for scientific research in Australia)

used AWS Lambda functions to completely re-engi-Scan2 that had been developed in a traditional clu **CRISPR gene editing sites** through simulation. T Lambda, and other "serverless" functions in AWS, developers at CSIRO.

AWS Lambda (see chapter 7.5) is a service that d of languages into the cloud natively, triggered dire The infrastructure (hardware, operating system an Lambda is managed by AWS and scales rapidy. 1 personalized treatment, because the complexity of

dramatically. A typical GTScan-2 job takes less than a minute, but the variation between jobs ranges from 1 second to 5 minutes. This fast fluctuation in load over minutes rather than hours, and the need for rapid turn-around times meant that large amounts of server hardware could end up idle simply waiting for a job to arrive. A naïve EC2-based solution would also be limited, since new instances – which may take minutes to deploy - would come online too slowly to keep the runtime stable. But with AWS Lambda, the AWS Research Cloud Program Accelerating Science and Innovation



these models on GPU instances in the cloud. This is just the beginning! You can run Jupyter notebooks on any instance types available in EC2. You can use Jupyter to run big data analytics using Amazon EMR (a managed Hadoop platform on AWS), and you can even control HPC clusters from the comfort of your Jupyter Notebook as well.

We'd also love to hear about your use case and what you're looking to do with AWS.

Don't forget to the turn your AWS resources off when you are finished!

#### 9.3.4 Further tutorials

Run Jupyter Notebook and JupyterHub with an Amazon EMR cluster: https://aws.amazon.com/blogs/blg-data/running-jupyter-notebook-and-jupyterhub-onamazon-emr/

UK Met Office has made 80TB of MOGREPS dataset with meteorological (weather) data available on S3 through the AWS Open Data program. They've published 2 tutorial notebooks showing you how to pull data from the data set, manipulate it, and visualize it. It uses the Iris python library for much of this. See

http://data.informaticslab.co.uk/mogreps\_data\_basics.html and http://data.informaticslab.co.uk/mogreps\_data\_intermediate.html



The Awesome Data Science YouTube video tutorial is an excellent series of tutorials about using Jupyter for the basics of Data Science in

Python. All the tutorials mentioned in this video tutorial series are available in their <u>GItHub</u> repository as well.

### Science use cases

## Step-by-step tutorials and links to further tutorials Written in the right tone for researchers

Technology			Product or Company Alces Flight Ltd.				Home Page http://www.alces-flight.com									
	Par	tner				ay of Ce Cingd		Deliv	ery me		ws	Mark	etpla	ce		
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#### 12.3 Alces Flight

Alces Flight Compute provides a fully-featured, scalable High Performance Computing (HPC) environment for research and scientific computing. Compatible with both ondemand and spot instances, Flight rapidly delivers a whole HPC cluster, ready to go and complete with job scheduler and applications.

Clusters are deployed in a Virtual Private Cluster (VPC) environment for security, with SSH and graphical-desktop connectivity for users. Data management tools for POSIX and S3 object storage are also included to help users transfer files and manage storage resources.

#### 12.3.1 How is it accessed?

Alces Flight Compute is available in a solo user experience in the Marketplace, with multi-user and companion appliances available by contacting your AWS Account Manager or Alces Flight directly. Read on to see which version is right for you:

	Available in AV		
Flight Compute feature	Solo Community Edition	Solo Professional Edition	Enterprise Edition
HPC job scheduler (Open Grid Scheduler/SGE)	V	V	V
Alces Gridware software application library	1	1	1
Interactive graphical desktop sessions	N	1	V
Secure VPN access	1	4	1
Community support	1	4	V

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AWS Research Cloud Program Accelerating Science and Innovation



#### Who is it for?

Alces Flight Solo is designed for use by end-users - that's the scientists, researchers, engineers and software developers who actively run compute workloads and process data. Flight provides tools that enable self-service - it's very configurable, and can be expanded by individual users to deliver a scalable platform for computational workloads.

#### Prereguisites

To get started you need three things:

- Access to some computers
- A client device
- Access to cloud resources (AWS Account)

Check out our full prerequisites list here: http://docs.alcesflight.com/en/stable/overview/whatisit.html#prerequisites

#### Where can I get help?

The online documentation (http://doce.alons.fight.com) is designed to walk users

**Detailed 2-4p description of Partner solutions:** Shows the scope of our ecosystem. Many 3<sup>rd</sup> parties invest in HPC on AWS.

> Flight clusters, report any bugs with the software, and share knowledge to help everyone work more effectively. There is no payment for using this service except for the general requirement to be nice to each other.

#### Creating your Cluster

The simplest method of launching a cluster in the AWS Marketplace is by following these steps:

- 1. Create (if you haven't already) and sign-in to your AWS account and navigate to the AWS Marketolace
- 2. Search for Alces Flight in the search box provided to find the Alces Flight Solo Community Edition (or Solo Professional if you wish to use our paid service) and click to select it
- 3. Read the product information and click on the Continue button to view details on how to launch.
- After clicking the Continue button from the main product page select the Custom Launch tab in your browser.
- 5. Scroll down the page and select your local AWS region in the Select a Region section.



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Build institutional cloud competency Support for domain specialists who want to use cloud Platforms to help end users consume cloud services (credentials, security, compliance, billing, ...)



## Pacific Northwest National Lab (PNNL): Supporting research



https://www.voutube.com/watch?v=hcnhdwnSY94

### Enabling research with AWS



Environments



- Research is the life blood of the organization
- Researchers should not be troubled with environment configurations, optimizations, etc.
- Software engineers provide expertise needed to build applied solutions
- Utilizing AWS has been a turning point.
- AWS has dramatically helped to improve collaboration.
- AWS fits better with our Agile software processes



### Moving to the cloud



- Lack of resources internally (hardware and people)
- Customer deliverables and demands / deadlines

### Concerns

- Cost
- Vendor lock-in

### **Initial Approach**

- Fork-lift model
- Missed out on AWS services
- Still had operational headaches

### **Current Approach**

Serverless wherever possible



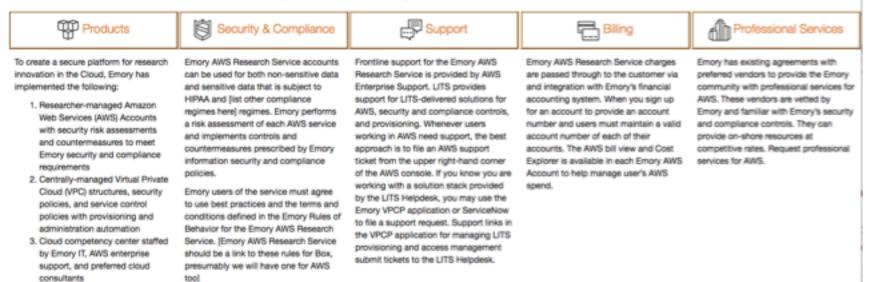
### As a result, researchers can focus on the problem

### **Our progression to AWS**

## **Emory-specific AWS landing page**



### Explore the Emory AWS Research Service



### https://edscoop.com/emory-university-research-aws-cloud-rich-mendola

# **Thank You & Homework**

Sign up for the Researchers' Handbook for AWS at aws.amazon.com/rcp . Browse data at https://registry.opendata.aws

Tutorials:

- If you have your own AWS account, use that.
- The Alces Flight demo will run in an Alces account, but you won't have to worry about it.
- You can run the SageMaker demos in this account (today only):

https://001868661679.signin.aws.amazon.com/console user: unidata ; p/w: unidata2018

- Alces Flight compute cluster NAMD tutorial: Launch "Performance Compute (SGE)" cluster at <u>https://launch.alces-flight.com/default/launch</u>, wait for e-mail confirmation, then tutorial from <u>http://docs.alces-flight.com/en/stable/getting-started/environment-usage/using-openfoam-with-alces-flight-compute.ht</u>ml
- 2. WRF4.0 on AWS: http://www2.mmm.ucar.edu/wrf/OnLineTutorial/wrf in cloud aws tutorial.php
- 3. GEOS-CHEM on AWS: http://cloud-gc.readthedocs.io/en/latest/chapter02\_beginner-tutorial/quick-start.html
- 4. Containers + AWS Batch for DNA sequencing: https://aws.amazon.com/blogs/compute/building-high-throughput-genomics-batch-workflows-on-aws-introduction-part-1-of-4/
- 5. Containers WRF Big Weather Web: www.bigweatherweb.org
- 6. Serverless Computing PyWren: <a href="http://pywren.io/pages/gettingstarted.html">http://pywren.io/pages/gettingstarted.html</a>

then <a href="https://github.com/pvwren/examples/">https://github.com/pvwren/examples/</a>

7. SageMaker Machine Learning labs: files from https://bit.lv/2HhD2SG ; instructions at https://github.com/wleepang/sagemaker4research-workshop ; further labs at https://developmentseed.org/blog/2018/01/19/sagemaker-label-maker-case/ and https://aws.amazon.com/blogs/machine-learning/simulate-quantum-systems-on-amazon-sagemaker/

## **Alces Launch - tokens**

- nice-azure-stallion
- vainly-mysterious-parakeet
- magenta-barbarous-pig
- bitterly-cooing-wolverine
- generously-handsome-thermometer
- triumphantly-old-ring
- repeatedly-please-paint-brush
- painfully-dark-deer
- optimistically-worry-alligator
- loud-stallion-parakeet