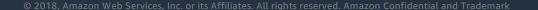


# **Open Data on AWS**

https://opendata.aws



#### Why does AWS care about open data?

Sharing data on AWS makes it accessible to a large and growing community of researchers, entrepreneurs, and enterprises who use the AWS Cloud.





Many AWS customers supply data to the public to accelerate research and product development. Many AWS customers use data shared on AWS to create new products and services.



The AWS Open Data program expands access to data by staging it for analysis in the cloud.

https://opendata.aws



# "No matter who you are, most of the smartest people work for someone else."

— Bill Joy, co-founder of Sun Microsystems



## How can we maximize access to data?



### **AWS Public Datasets**

#### https://registry.opendata.aws























#### **Traditional data acquisition**



"...data must be organized, well-documented, consistently formatted, and error free. Cleaning the data is often the most taxing part of data science, and is frequently 80% of the work."

— Data Driven by DJ Patil and Hilary Mason



## Undifferentiated heavy lifting

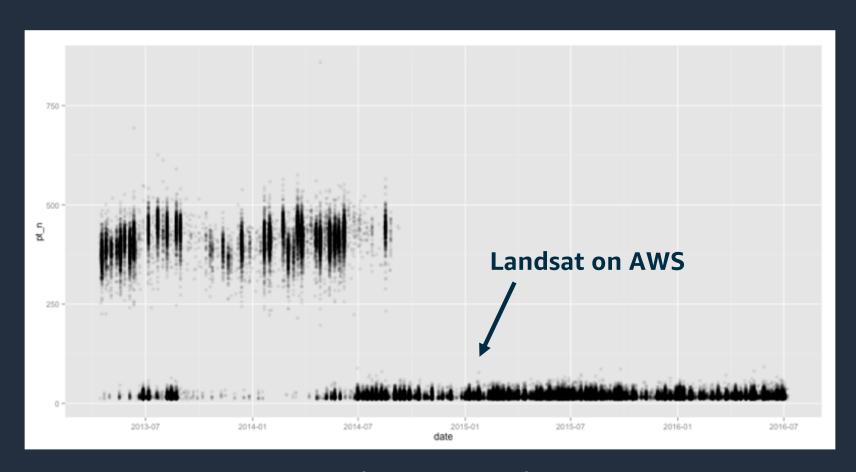


# It's easier to bring algorithms to data than to bring data to algorithms.



It is more efficient to bring computing resources to data than to download and copy data to local computing resources.





Graph by Drew Bollinger (@drewbo19) at Development Seed

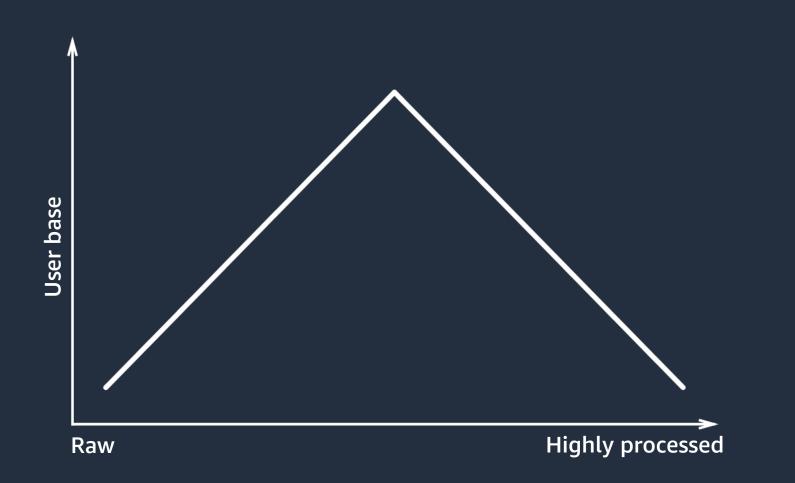


## How can we maximize access to data?

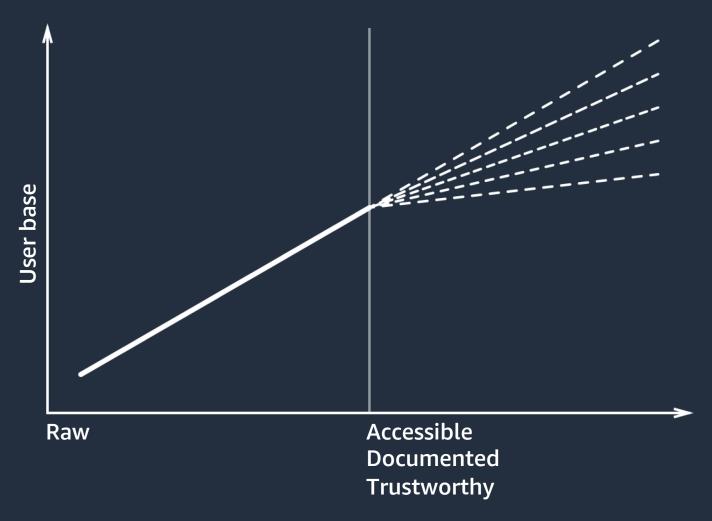
https://registry.opendata.aws

https://aws.amazon.com/earth/research-credits











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#### Earth Science Information Partners



















## Many users = many use cases and tools

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The universe of meteorological data users is expanding to include:

- Economists
- Software developers (web and app developers)
- Young students
- Amateurs

#### These users have different:

- Skills
- Tools
- Needs



### Big is different

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- Object storage is different than file storage
- Toolmakers must keep up with emerging formats
- A number of cloud-friendly formats are emerging
  - Cloud-optimized GeoTIFF (cogeo.org)
  - Zarr
  - NetCDF to Parquet/ORC



#### **Archive of Convenience**

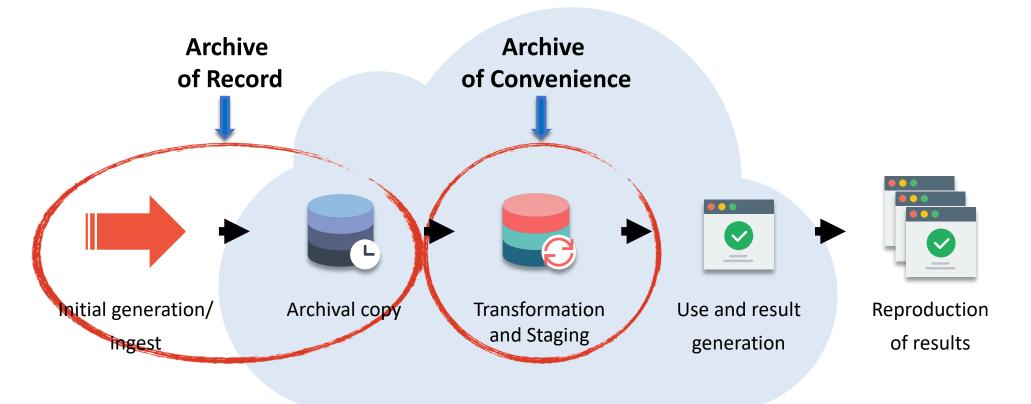
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Element 84 presented an approach to managing complex datasets on the cloud called the Archive of Convenience.

- Remove the undifferentiated heavy lifting of data wrangling
- Exploit ephemeral nature of the cloud for both storage and services
- Created with automated, repeatable, trustworthy processes
- Strive for compatibility between datasets, formats, and tooling
- Use case Oriented



## Lifecycle of data in the cloud



Element 84

#### **Pangeo**

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The PanGeo community (pangeo.io) is experimenting with ways to share large volumes of NetCDF/HDF in the cloud.

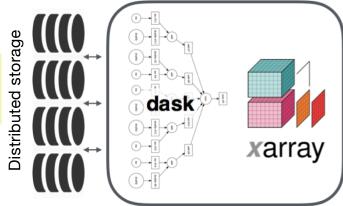
- https://bit.ly/big-data-non-portal
- Zarr
  - Simple format, clear specification
  - Data is chunked and can be accessed in parallel
  - lightweight global and variable metadata stored as JSON
  - Free, open-source software
  - Read/write using Xarray



# Pangeo Architecture

Cloud

"Analysis Ready Data" stored on globally-available distributed storage.



Jupyter for interactive access on remote systems



end user



Parallel computing system allows users deploy clusters of compute nodes for data processing.

Dask tells the nodes what to do.

Xarray provides data structures and intuitive interface for interacting with datasets

Jed Sundwall jed@amazon.com

