





Earth Engine Overview

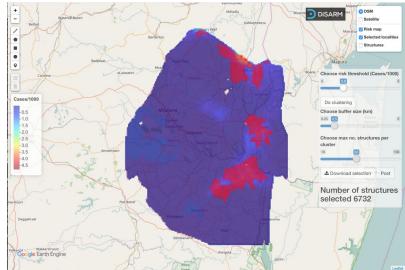
Michael DeWitt
Sr. Software Engineer,
Google Earth Engine

#GeoForGood19

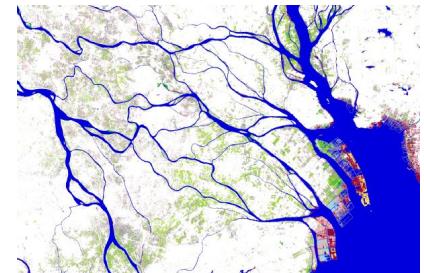
At a high level...



- Why build Earth Engine?
- What have we made?
- How do people use it?
- A brief peek under the hood
- Where is it going?



Infectious disease

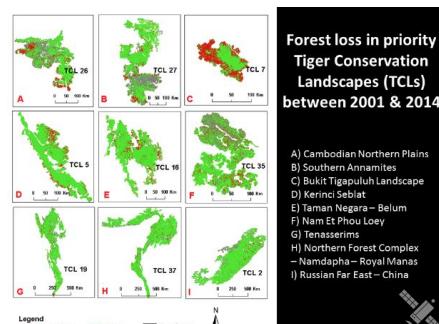


Access to water

In order to make progress on global problems, researchers and decisionmakers need to be able to ask questions of increasingly large and complex geospatial datasets.



Deforestation

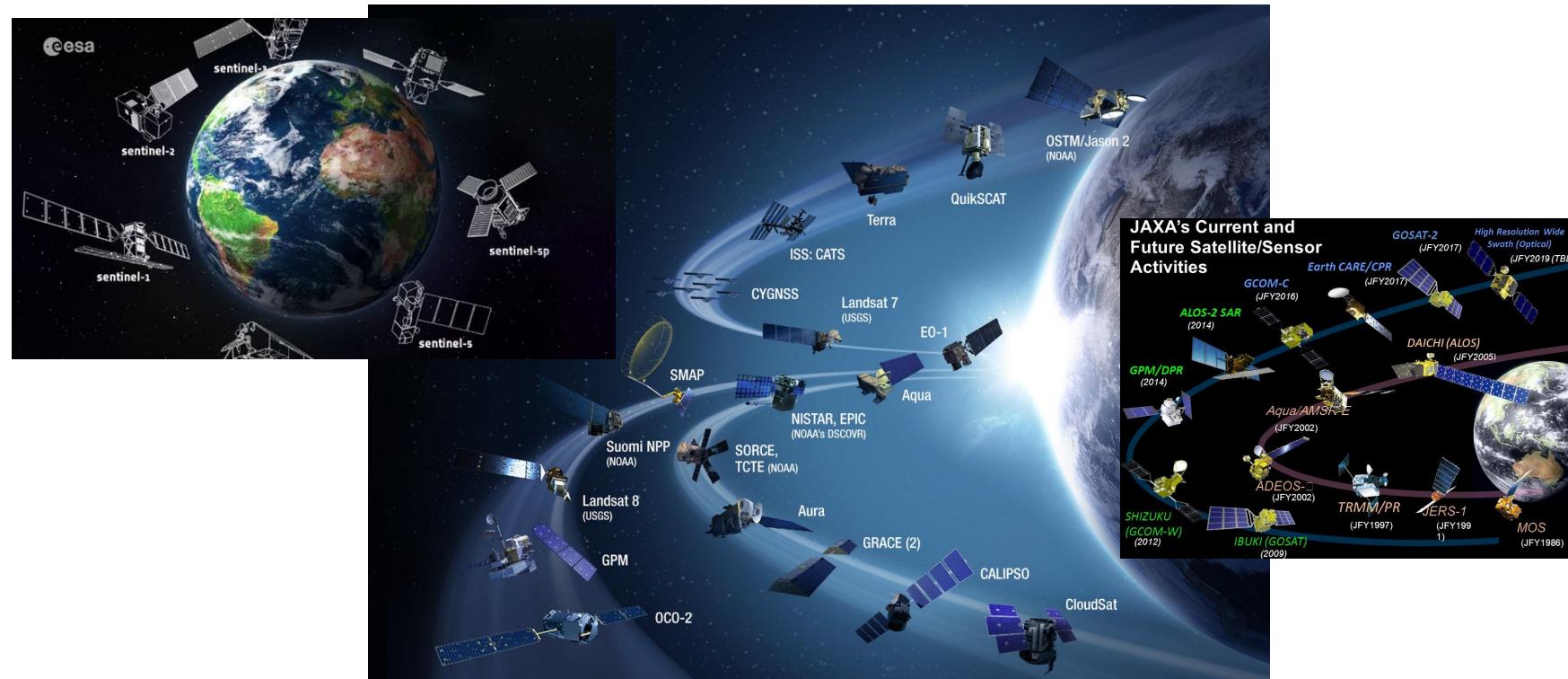


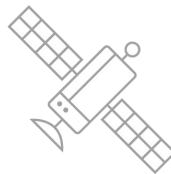
Threats to biodiversity



Climate change

There are a lot of data to manage.





Using these datasets requires lots of computational power.



Next-generation Digital Earth

Goodchild et al. (2012):

Michael F. Goodchild^{a,1}, Huadong Guo^b, Alessandro Annoni^c, Ling Bian^d, Kees de Bie^e, Frederick Campbell^f, Max Craglia^c, Manfred Ehlers^g, John van Genderen^e, Davina Jackson^h, Anthony J. Lewisⁱ, Martino Pesaresi^c, Gábor Remetey-Fülöpp^j, Richard Simpson^k, Andrew Skidmore^f, Changlin Wang^b, and Peter Woodgate^l

^aDepartment of Geography, University of California, Santa Barbara, CA 93106; ^bCenter for Earth Observation and Digital Earth, Chinese Academy of Sciences, Beijing 100094, China; ^cJoint Research Centre of the European Commission, 21027 Ispra, Italy; ^dDepartment of Geography, University at Buffalo, State University of New York, Buffalo, NY 14261; ^eFaculty of Geo-Information Science and Earth Observation, University of Twente, 7500 AE, Enschede, The Netherlands; ^fFred Campbell Consulting, Ottawa, ON, Canada K2H 5G8;

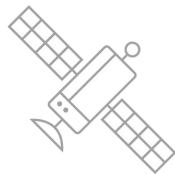
^gInstitute for Geoinformatics and Remote Sensing, University of Osnabrück, 49076 Osnabrück, Germany; ^hD_City Network, Newtown 2042, Australia; ⁱDepartment of Geography and Anthropology, Louisiana State University, Baton Rouge, LA 70803; ^jHungarian Association for Geo-Information, H-1122, Budapest, Hungary; ^kNextspace, Auckland 1542, New Zealand; and ^lCooperative Research Center for Spatial Information, Carlton South 3053, Australia

“The supply of geographic information from satellite-based and ground-based sensors has expanded rapidly, encouraging belief in a new, fourth, or “big data,” paradigm of science that emphasizes **international collaboration, data-intensive analysis, huge computing resources, and high-end visualization.**”

Why is Earth Engine?



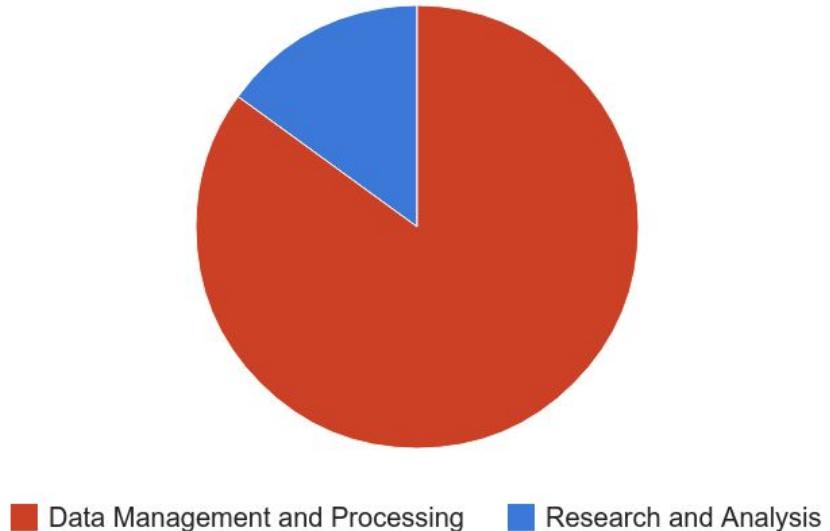
There are many domains where theory has outpaced the practical scale of applications; in essence, progress is limited by access to scalable IT.

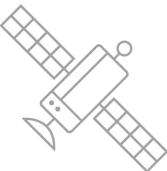


State of the Art

Researchers spend a majority of their time doing "IT work."

Time Spent Working with GIS Data



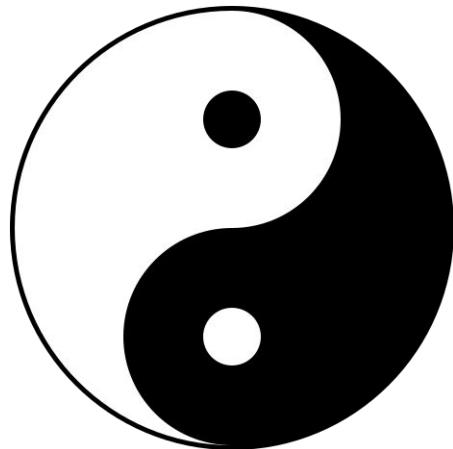


A Better Way

"Often it turns out to be more efficient to move the questions than to move the data."

- Jim Gray

Ideally, the data and the computational infrastructure would be colocated, and there would be an easy way to use them to derive knowledge.





Why is Google?

Our mission is to **organize** the world's **information** and make it **universally accessible** and **useful**.

<https://about.google/intl/en/>



Why is Earth Engine?

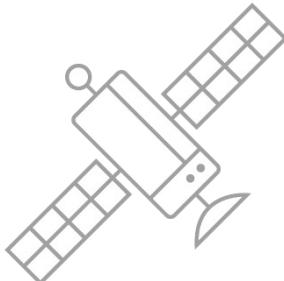
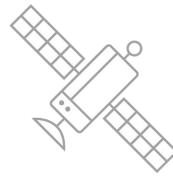
geospatial

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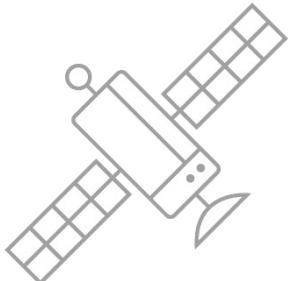
What are our goals?

- Build the world's most advanced platform for geospatial data analysis.
- Seamlessly integrate it into Google's products and services.
- Use it to make substantive progress on global challenges.



Earth Engine in Three Sentences

Earth Engine is Google's platform for doing scientific analysis of large-scale Earth data, including satellite imagery, census data, etc. It's composed of two big components: a **collection of scientific data**, and the **computational power** to effectively work with data at that scale.

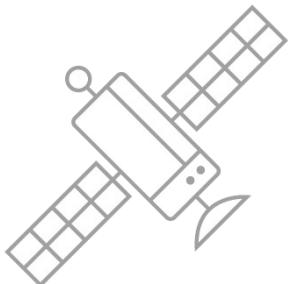


The **Earth Engine API** is the interface through which scientists and researchers express the operations they'd like Earth Engine to perform.

Earth Engine in Three Sentences

Earth Engine is Google's platform for doing scientific analysis of large-scale Earth data, including satellite imagery, census data, etc. It's composed of two big components: a **collection of scientific data** (more than 25PB!), and the **computational power** to make sense of data at that scale.

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The Earth Engine Data Catalog



Landsat & Sentinel

10-30m, weekly



MODIS

250m daily

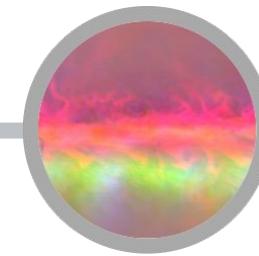


Vector Data

WDPA, TIGER, WHC



Terrain & Land Cover



Weather & Climate

NOAA NCEP, OMI, ...

... and upload your own vectors and
rasters

600+ public datasets

29+ petabytes of data

100+ datasets added yearly

1+ PB of new data every month



API Client Libraries

API bindings for:

- JavaScript
- Python

Open-sourced on GitHub,
PyPI, npm (and a growing
list of others).

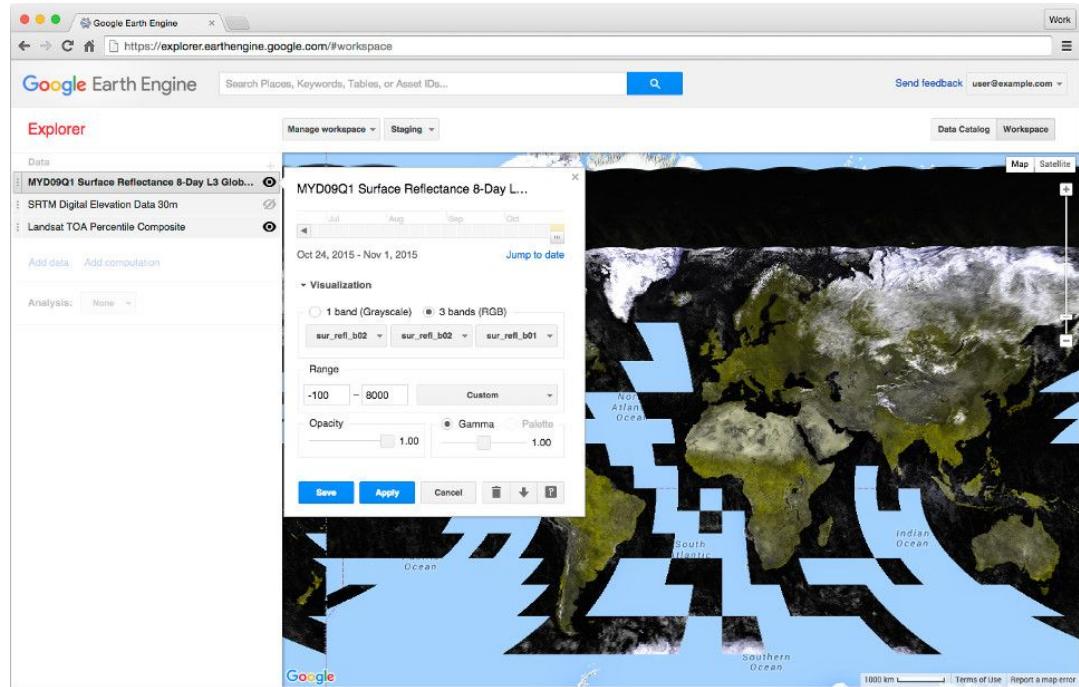


github.com/google/earthengine-api

Earth Engine Explorer

A simple interface for performing visualization and classification tasks.

The Explorer drives a substantial portion of Earth Engine traffic.



The Code Editor

A web-based environment
for:

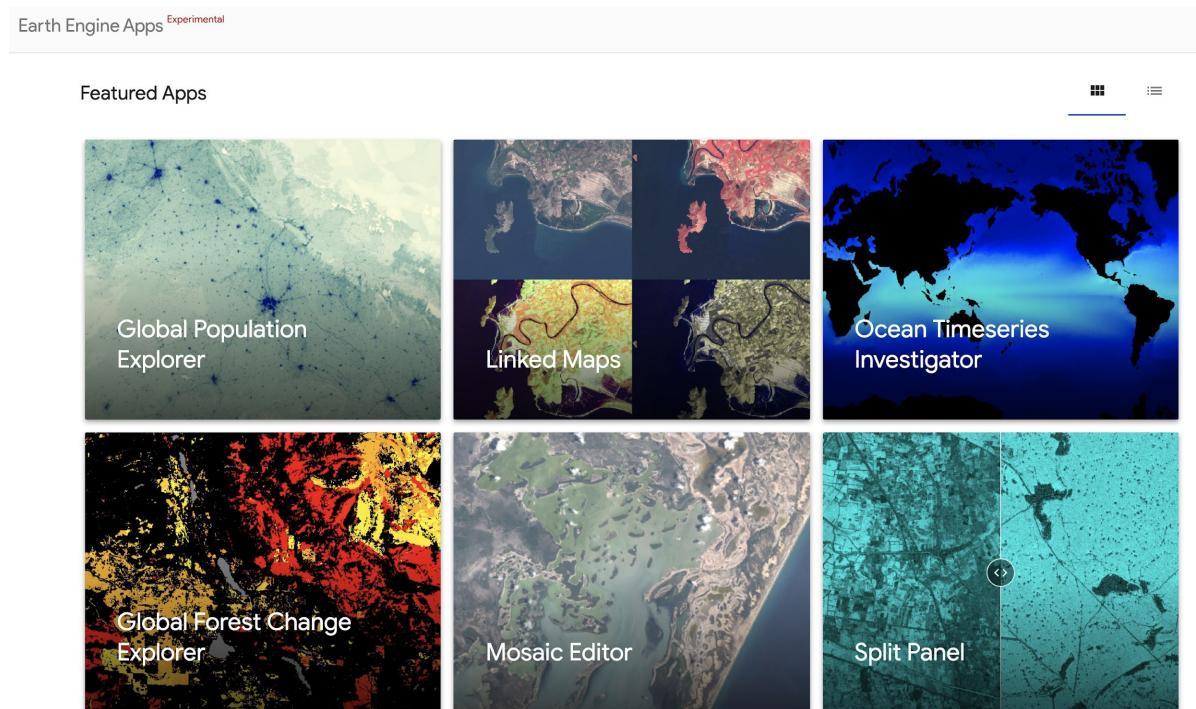
- performing analyses
- investigating datasets
- managing scripts, data
- building interactive tools

The screenshot shows the Google Earth Engine Code Editor interface. At the top, there's a search bar and navigation buttons for Help and user account. The main area is divided into several panels:

- Scripts:** A sidebar listing various analysis functions like Charts, Doy Series, and Cloud Masking.
- Code Editor:** The central panel contains a script with code for defining regions and creating charts. The code uses the ee.Geometry.Rectangle API to define regions for a forest, desert, and western US regions, and then creates charts for band means across different years and regions.
- Map:** A map view at the bottom left shows a green polygon drawn over a terrain, with a rectangle tool active.
- Inspector:** A panel on the right showing the properties of selected features.
- Console:** A panel showing the output of print statements from the script.
- Tasks:** A panel showing the status of tasks.
- Three Charts:** Three line charts in the center-right show "Band mean by day of year across years" (B1_mean, B2_mean, B3_mean), "B1 mean by day of year in different years" (2018, 2016, 2017, 2014, 2015, 2013), and "B1 mean by day of year in 3 regions" (City, Forest, Desert).

Earth Engine Apps

EE Apps are "Code Editor" windows without the code.
They enable EE users to
create tools for *their* users.





Publications and Applications

Planetary-scale geospatial analysis for everyone (Gorelick, 2017)

[Timelapse](#)

Forest (Hansen, 2013)

[DiSARM](#)

Surface water (JRC, 2016)

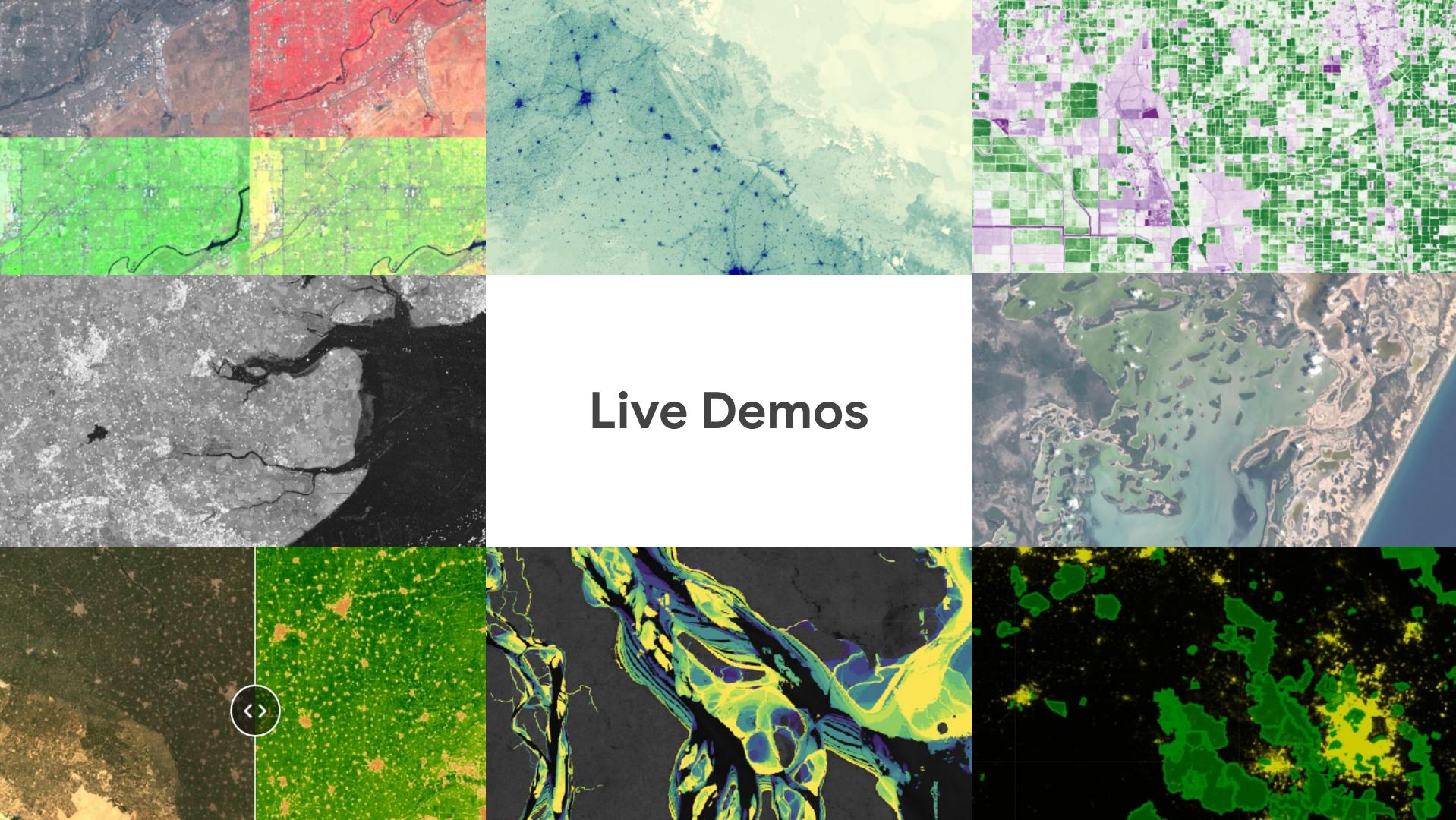
[Global Forest Watch](#)

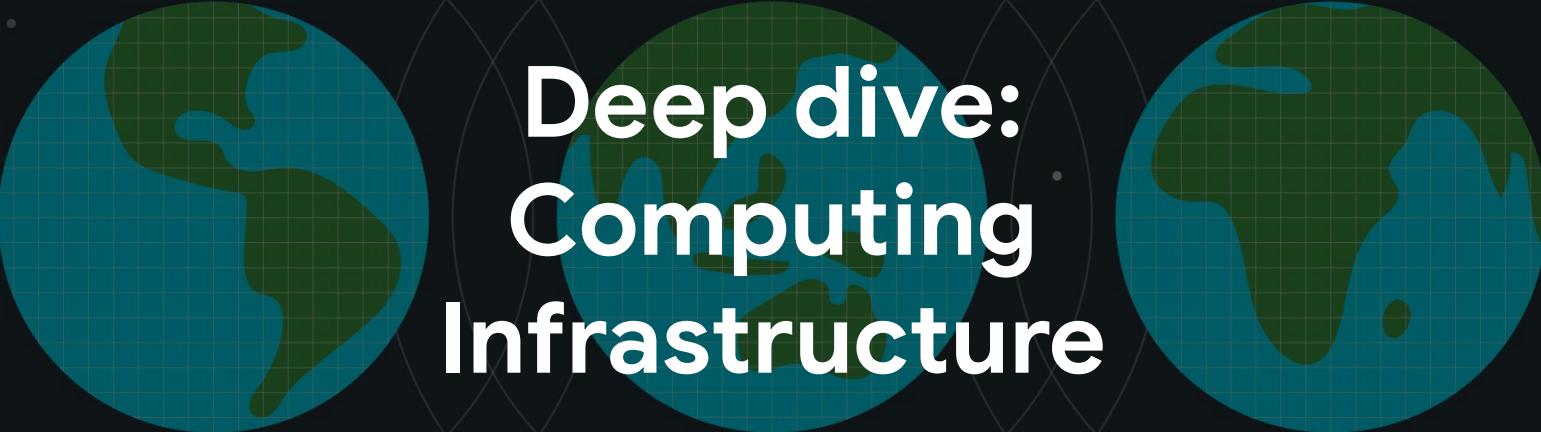
Tidal flats (Murray, 2019)

Internal Google projects
- Google Earth
- Crisis Response

More [here](#).

Live Demos





Deep dive: Computing Infrastructure

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Get an image



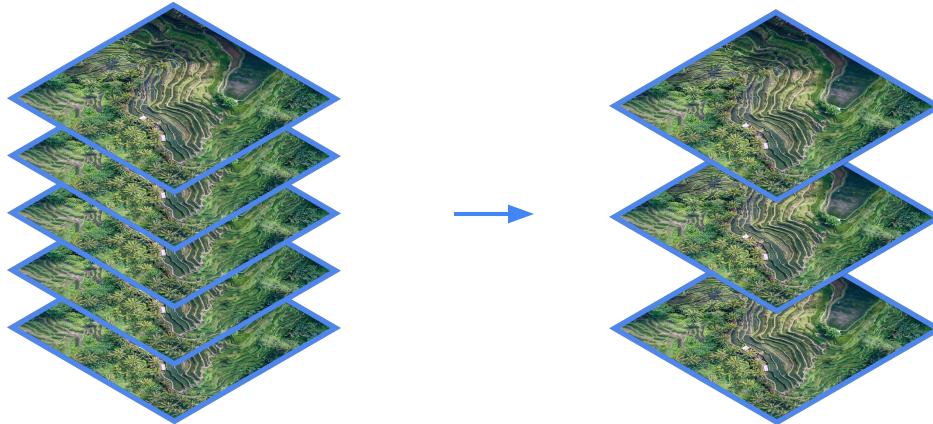
Pick your:
projection, resolution, bands, bounding-box, visualization

Apply an algorithm to an image



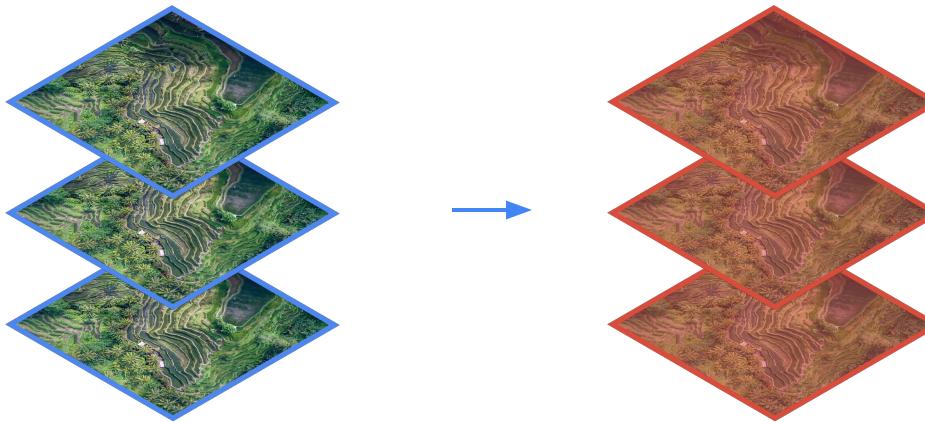
Use library functions or script your own

Filter a collection



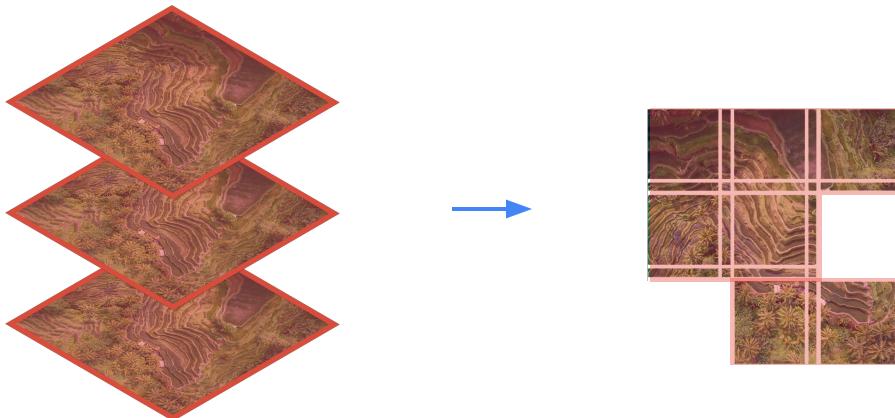
Time, space & metadata search

Map an algorithm over a collection



$N \rightarrow N$

Reduce a collection

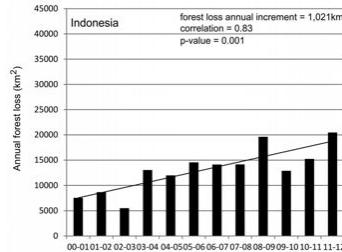


$N \rightarrow 1$ or $N \rightarrow M$

Compute aggregate statistics

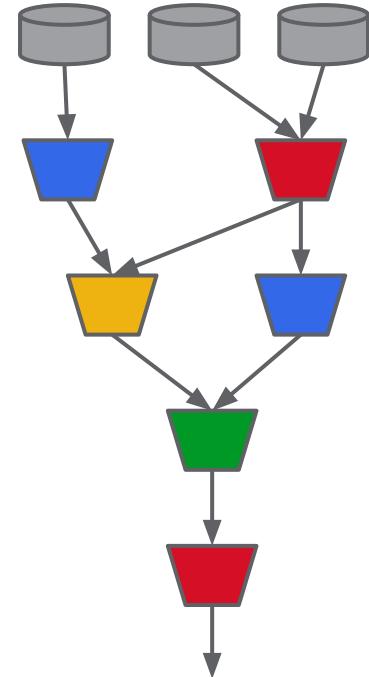


Gabon	1891	391	11898
Lithuania	1845	1226	40296
Cuba	1725	2271	68008
Mali	1694	0	1247103
Costa Rica	1653	382	11327
Czech Republic	1646	1331	46934
South Sudan	1635	38	460581
North Korea	1605	137	67695
Italy	1603	898	201331



Expressions and Lazy Evaluation

- Earth Engine expressions define new objects in terms of existing objects, as a **directed acyclic graph**.
- Users can define **custom functions** in terms of other functions.
- The core Image and Collection types are **lazy** and **inherently parallel**.
- Computations are specified by an expression + a selector (i.e. which part of the result is needed — for a raster, which pixels at what resolution)







Current and future directions

Google Cloud tie-ins

Improved Code Editor interface

TensorFlow integration

Earth Engine Apps

Data format support

Programming language features

Lower-latency data ingestion

Further reading:

- earthengine.google.com
- [Earth Engine 101](#)
- [Developers' site](#)

Recap: At a high level...



- Why build Earth Engine?
To ensure that global challenges aren't limited by IT.
- What have we made?
A large-scale computing system with an app ecosystem on top.
- How do people use it?
They publish scripts, apps, papers, datasets...
- A brief peek under the hood
Everything is parallel.
- Where is it going?
Up and to the right! 



Thanks!

#GeoForGood19

