



## Climate Engine - An Overview with a Focus on Drought and Restoration Use Cases

Adopting New Technologies and Earth Observations for Improved Early Warning, Natural Resource Management, and Decision Making

Justin Huntington, Eric Jensen, Kristen O'Shea  
Desert Research Institute - Climate Engine

Presentation to the Southwest Climate Adaptation Forum 2022  
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# Background

## The Big Data Problem.....

- Dramatic increase in the use of Earth Observation (EO) datasets is happening
- Combining multi-source EO is challenging for scientists and practitioners alike
- Best practices should follow Findable, Accessible, Interoperable, and Reusable (FAIR) data principles

*“If the data can’t work together, the scientists can’t either”*



# CREATING DATA TOOL KITS THAT EVERYONE CAN USE

BY ZHONG LIU, VASCO MANTAS, JENNIFER WEI,  
MENGLIN JIN, AND DAVID MEYER

Earth scientists need to make the growing wealth of data more accessible and build data services meant for interdisciplinary use.

**A**s Earth science and the technologies it uses evolve and improve, the data and services that support the science also change and become more complex, often spanning multiple disciplines. The ability to easily find and seamlessly access these data and services in an open and integrated environment is essential to facilitating interdisciplinary research and applications and to broadening data user communities. The sheer amount of available data is growing rapidly as the science community adopts the Findable, Accessible, Interoperable, and Reusable (FAIR) data principles (Wilkinson et al., 2016) and emerging technologies such as cloud computing. Even with recent advances in data archiving and services (e.g., more data sets and related information are available online with customized data services and multiple data access methods), accessing heterogeneous inter-

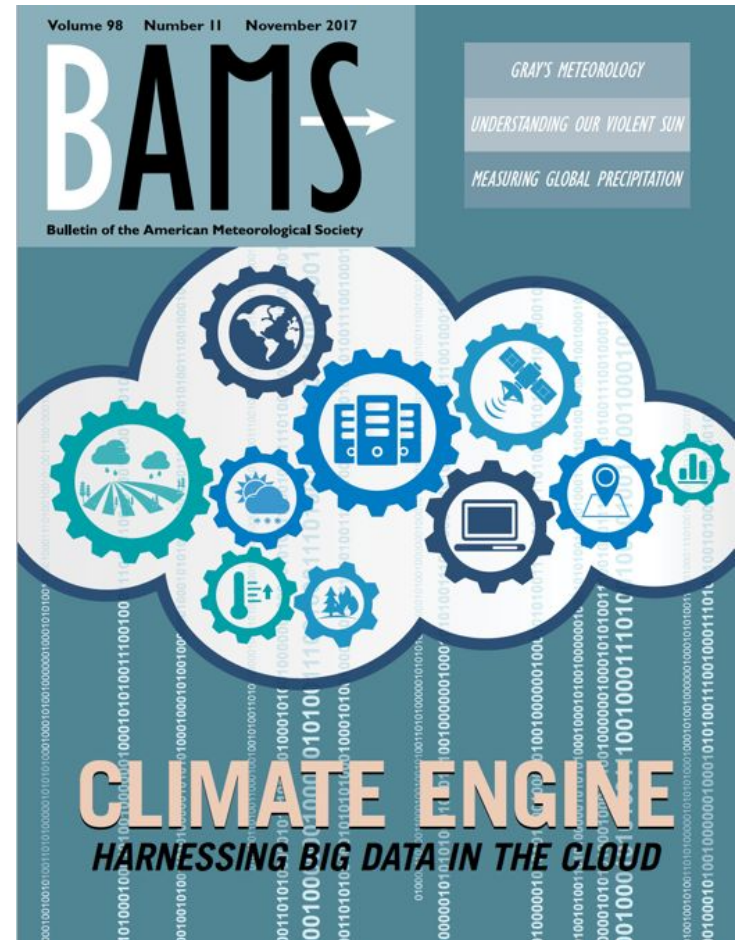
Multiple special or discipline-oriented tools, often with steep learning curves, are required to handle heterogeneous, complex, and evolving Earth science data sets in interdisciplinary research and applications. Credit: Photo by Deborah Green Whitting

# Background

- Climate Engine began in 2014 with a grant from the Google Earth Engine Faculty Research Award Program
- Since, it has been primarily supported by NOAA-NIDIS, BLM, USFS, and other federal agencies

\* *Public <> Private Partnership* \*

- Completed technology transfer in 2020 and partnered with Google Cloud to meet request of the private and public sector, and support technology problems and engagement
- Climate Engine helps to develop and deliver technology and geospatial data for actionable insights around sustainability, natural resources, climate risk, and early warning



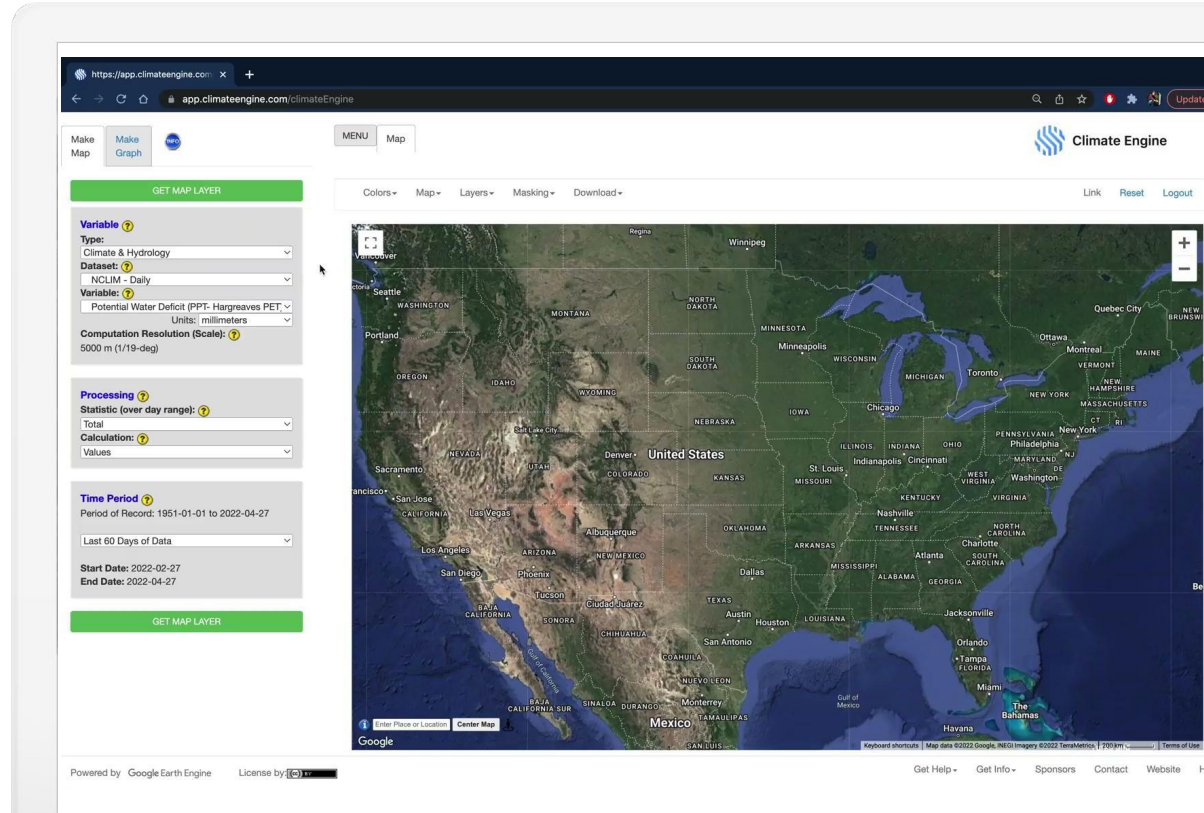
Huntington, J.L., Hegewisch, K.C., Daudert, B., Morton, C.G., Abatzoglou, J.T., McEvoy, D.J. and Erickson, T., 2017. Climate engine: Cloud computing and visualization of climate and remote sensing data for advanced natural resource monitoring and process understanding. *Bulletin of the American Meteorological Society*, 98(11), pp.2397-2410.

# Research & Visualize

## Climate Engine Research App

- Access to petabytes of climate and EO data
  - Historical, current, and forecasts
  - Multi-platform satellite products
- Google, NOAA, custom data catalogues
- On-demand data Processing
  - Values, anomalies, indices, trends, probabilities, zonal statistics
  - Interoperable calculations between climate and satellite data
- Download maps and time series data

<https://app.climateengine.com>



The screenshot displays the Climate Engine Research App interface. The browser address bar shows the URL <https://app.climateengine.com>. The app's navigation bar includes a 'MENU' button and a 'Map' button. The main interface is divided into a control panel on the left and a map on the right.

**Control Panel:**

- GET MAP LAYER** (Green button)
- Variable:**
  - Type: Climate & Hydrology
  - Dataset: NCLIM - Daily
  - Variable: Potential Water Deficit (PPT- Hargreaves PET)
  - Units: millimeters
  - Computation Resolution (Scale): 5000 m (1/19-deg)
- Processing:**
  - Statistic (over day range): Total
  - Calculation: Values
- Time Period:**
  - Period of Record: 1951-01-01 to 2022-04-27
  - Last 60 Days of Data
  - Start Date: 2022-02-27
  - End Date: 2022-04-27
- GET MAP LAYER** (Green button)

**Map:** A satellite-style map of the United States with a blue data layer overlay. The map includes labels for major cities and states. The interface also features a 'Colors' dropdown, 'Map' dropdown, 'Layers' dropdown, 'Masking' dropdown, and 'Download' dropdown. A 'Link', 'Reset', and 'Logout' menu is visible in the top right corner. The footer includes 'Powered by Google Earth Engine', 'License by (CC) BY', and a 'Keyboard shortcuts' link.

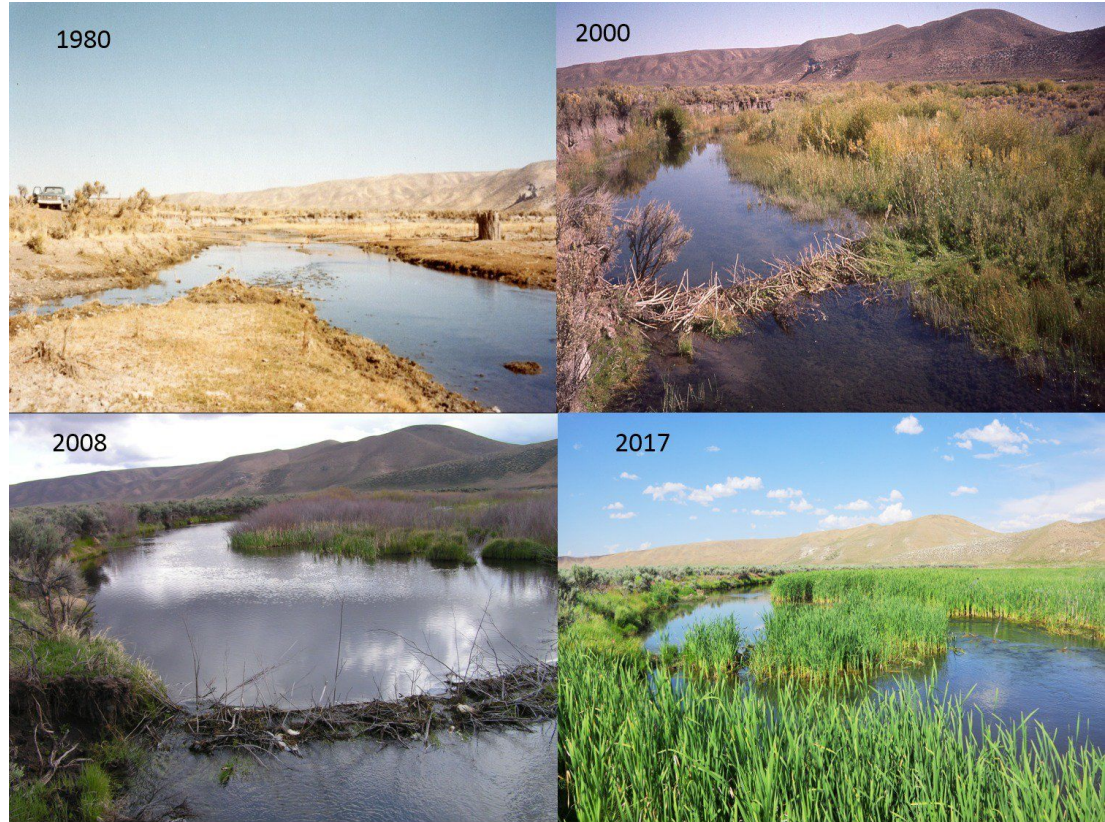


# Evaluating Restoration Outcomes with Climate Engine

## Four examples:

- Susie Creek, Nevada
- Upper Camp Creek, Oregon
- Upper Summit Spring, Nevada

Using remote sensing and climate data to evaluate outcomes of mesic restoration.

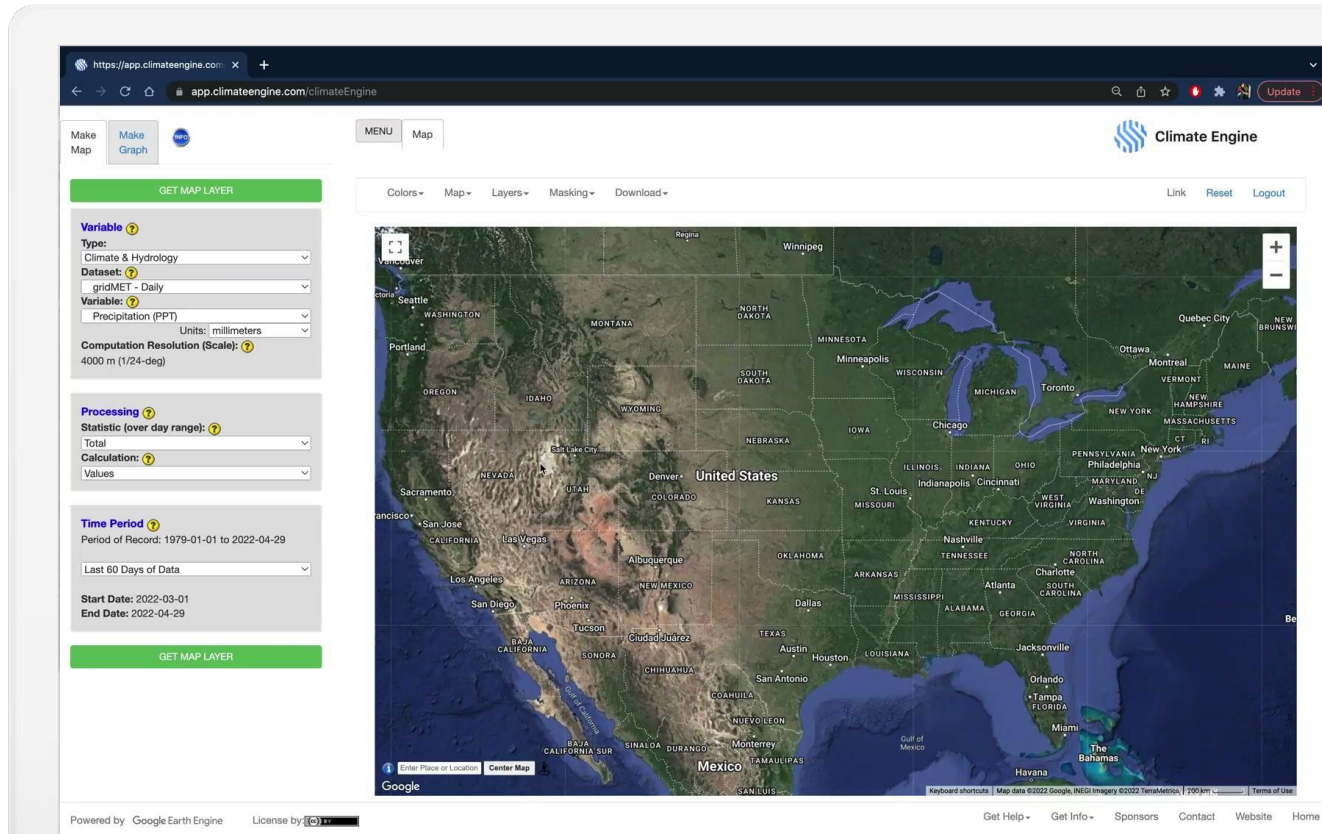


*Susie Creek, Credit Zack Wurtzebach*

# Evaluating Restoration Outcomes | Susie Creek, Nevada

- ⇒ Assess mesic vegetation **condition** during the summer months.
- ⇒ Assess **trends** in summer vegetation production in mesic systems.
- ⇒ Evaluate periods **before and after restoration** project to infer outcomes.
- ⇒ Account for **climate drivers** by incorporating precipitation and drought metrics.

*Restoration conducted in 1990s and 2000s, exclosures and changes to grazing.*





# Evaluating Restoration Outcomes | Upper Camp Creek, Oregon

- ⇒ Assess mesic vegetation **condition** during the summer months.
- ⇒ Assess **trends** in summer vegetation production in mesic systems.
- ⇒ Evaluate periods **before and after restoration** project to infer outcomes.
- ⇒ Account for **climate drivers** by incorporating precipitation and drought metrics.

*Restoration conducted between 2008-2011, beaver dam analogs.*



# Evaluating Riparian Condition | Upper Summit Spring, Nevada

U.S. Department of the Interior

Bureau of Land Management

Rangeland Health Assessment and Evaluation Report

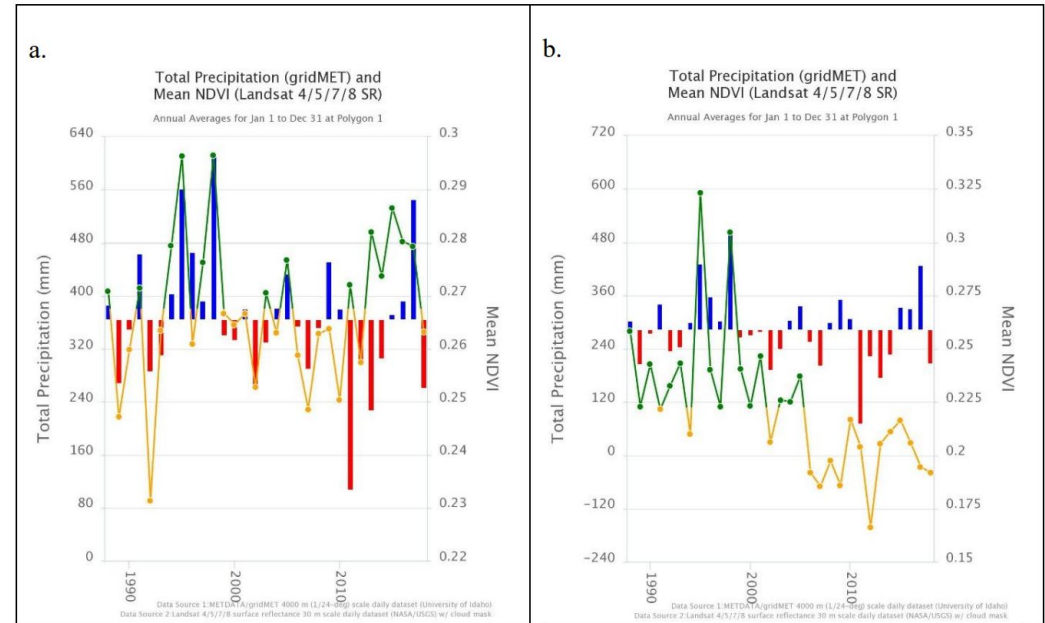
Pilot-Table Mountain Allotment

PREPARING OFFICE:

U.S. Department of the Interior  
Bureau of Land Management  
Carson City District  
Stillwater Field Office  
5665 Morgan Mill Road  
Carson City, NV 89701



Figure 13: NDVI Data Correlated to Precipitation for (a) Cornelius Spring and (b) Upper Summit Spring



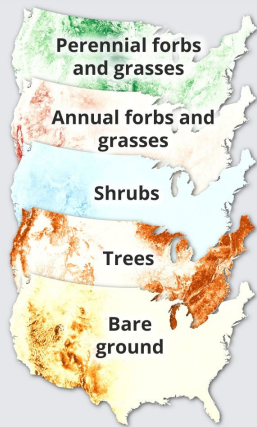
“Specifically, Upper Summit Spring appeared to have higher utilization rates and overall use of the spring, as indicated by the contributing factors for not meeting PFC listed in table 14. This included poor water quality and the lack of functional and structural plant groups due to overgrazing, which was not reported as a contributing factor at Cornelius Spring.”



# Analyze RAP in Climate Engine



## Vegetation Cover



Data layers

## Rangeland Production



Rangeland  
Analysis  
Platform



 Climate Engine<sup>®</sup>  
Research App

1

## Analyze RAP alongside:

Drought metrics

- SPEI
- Drought monitor
- Short- and long-term blends

Hundreds of climate/veg variables

- Precipitation
- Extreme heat
- Evapotranspiration

2

## Advanced visualization capabilities

- Trend maps
- Maps of departures from averages
- Percentile maps
- Advanced plotting capabilities with hundreds of variables

Spatial resolution

30-meter



30-meter



Frequency

Annual



16-day



Annual



Time period

1984–  
present

1986–  
present

Units

Percent cover

Pounds/acre

# Research to Decisions

## Bureau of Land Management

- 1 Analyze RAP alongside:**
- Drought metrics
    - SPEI
    - Drought monitor
    - Short- and long-term blends
  - Hundreds of climate/veg variables
    - Precipitation
    - Extreme heat
    - Evapotranspiration

- 2 Advanced visualization capabilities**
- Trend maps
  - Maps of departures from averages
  - Percentile maps
  - Advanced plotting capabilities with hundreds of variables



### Vegetation Cover



### Rangeland Production



Data layers

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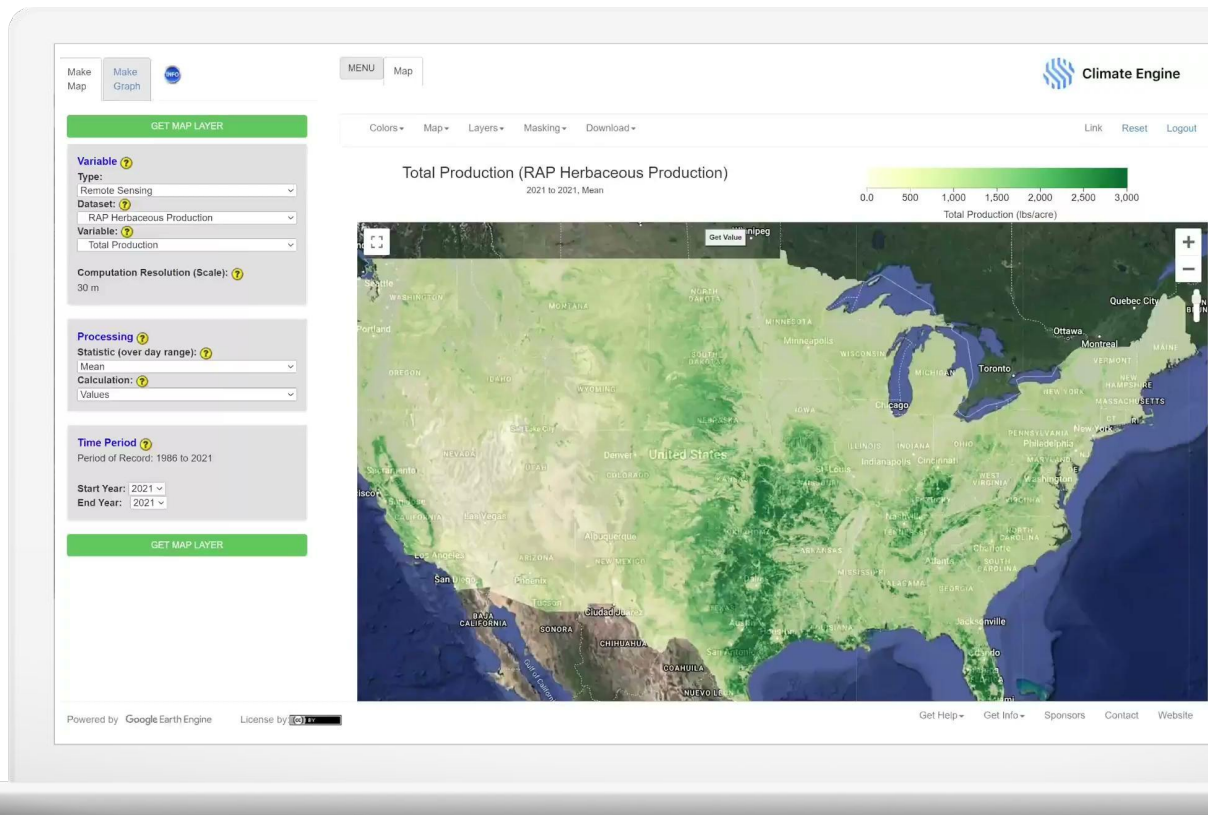


1984–present

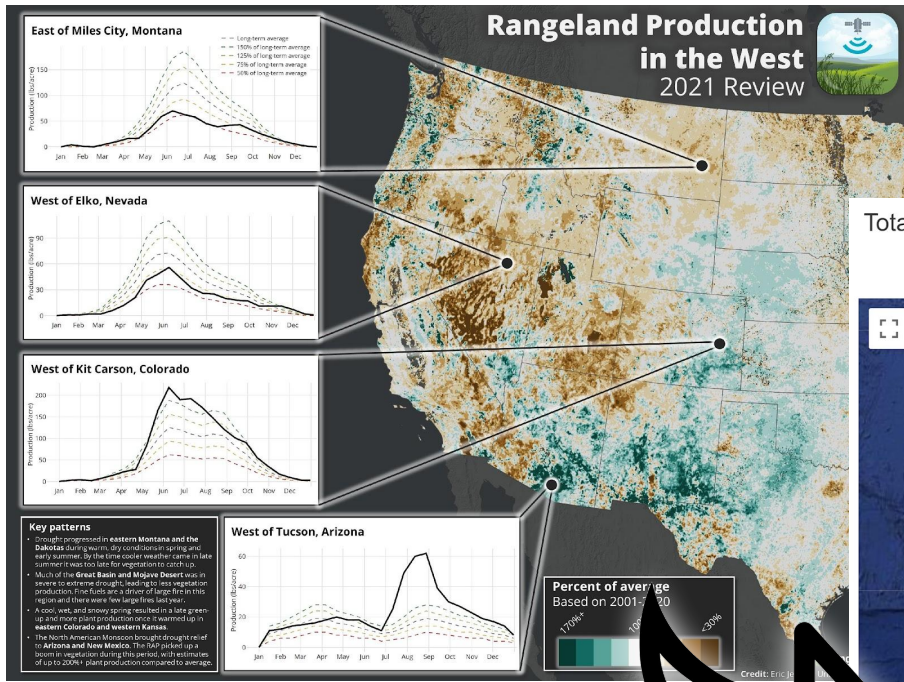
1986–present

Percent cover

Pounds/acre

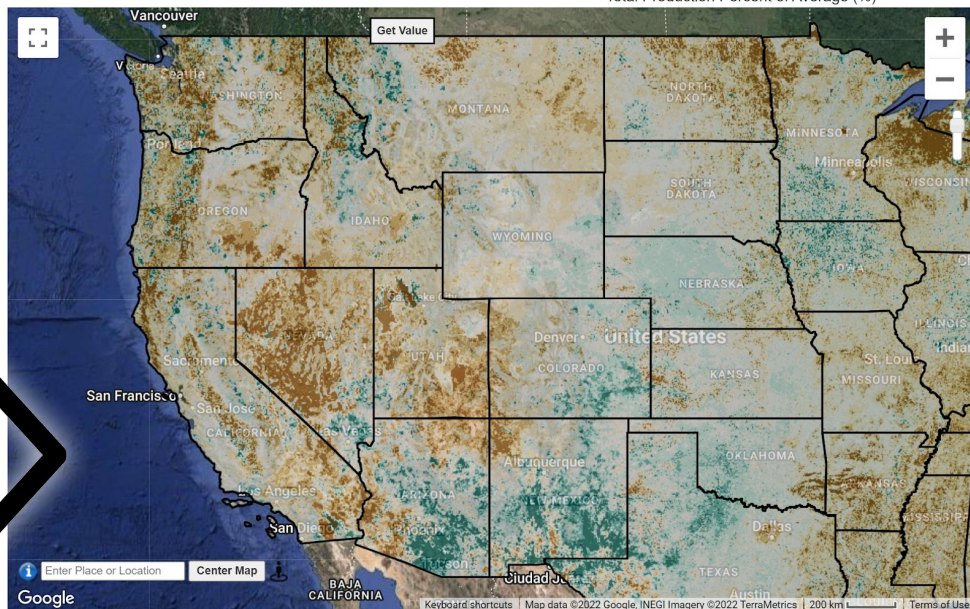
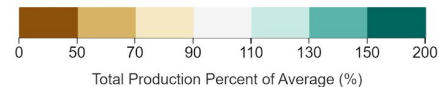


# Map Rangeland Production Anomalies | Compared to 2001-2020



Identical map produced without any code

Total Production Percent Of Average (RAP  
Herbaceous Production)  
2021 to 2021, Mean, vs. 2001 - 2020



Coded out map in Earth Engine



# Research to Operations

## Climate Engine API

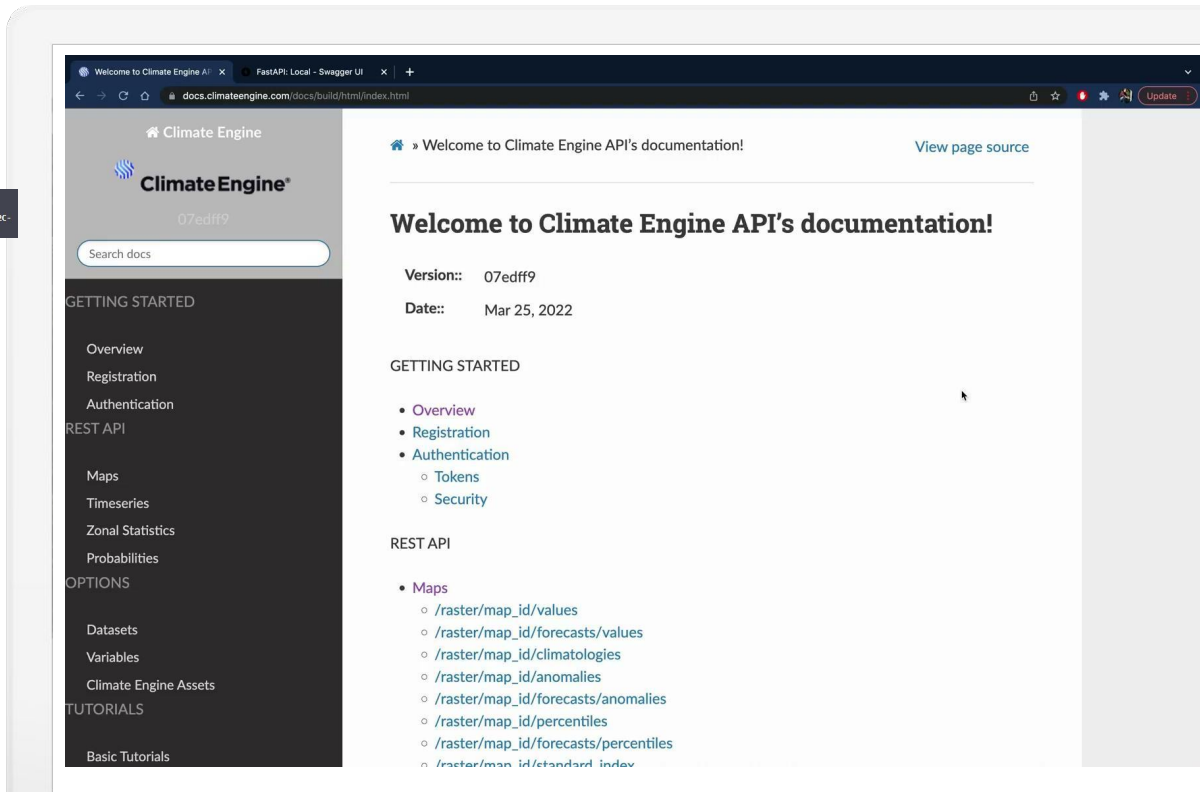
Google Earth  
Engine Script

Climate Engine  
REST API Call

```
https://gdata.dr1.edu/raster/export/standard_index?  
dataset=down101remd&start_date=2016-08-01&end_date=2016-10-  
30&start_year=2016&end_year=2016&bounding_box=52.72222039, 332-  
120.152338, 9950&export_path=nc1-nid1&Zfody_test&Zfjh_test_norm
```

Operational  
Results

<https://docs.climateengine.com>



# Questions and Discussion



## Thank you!

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