



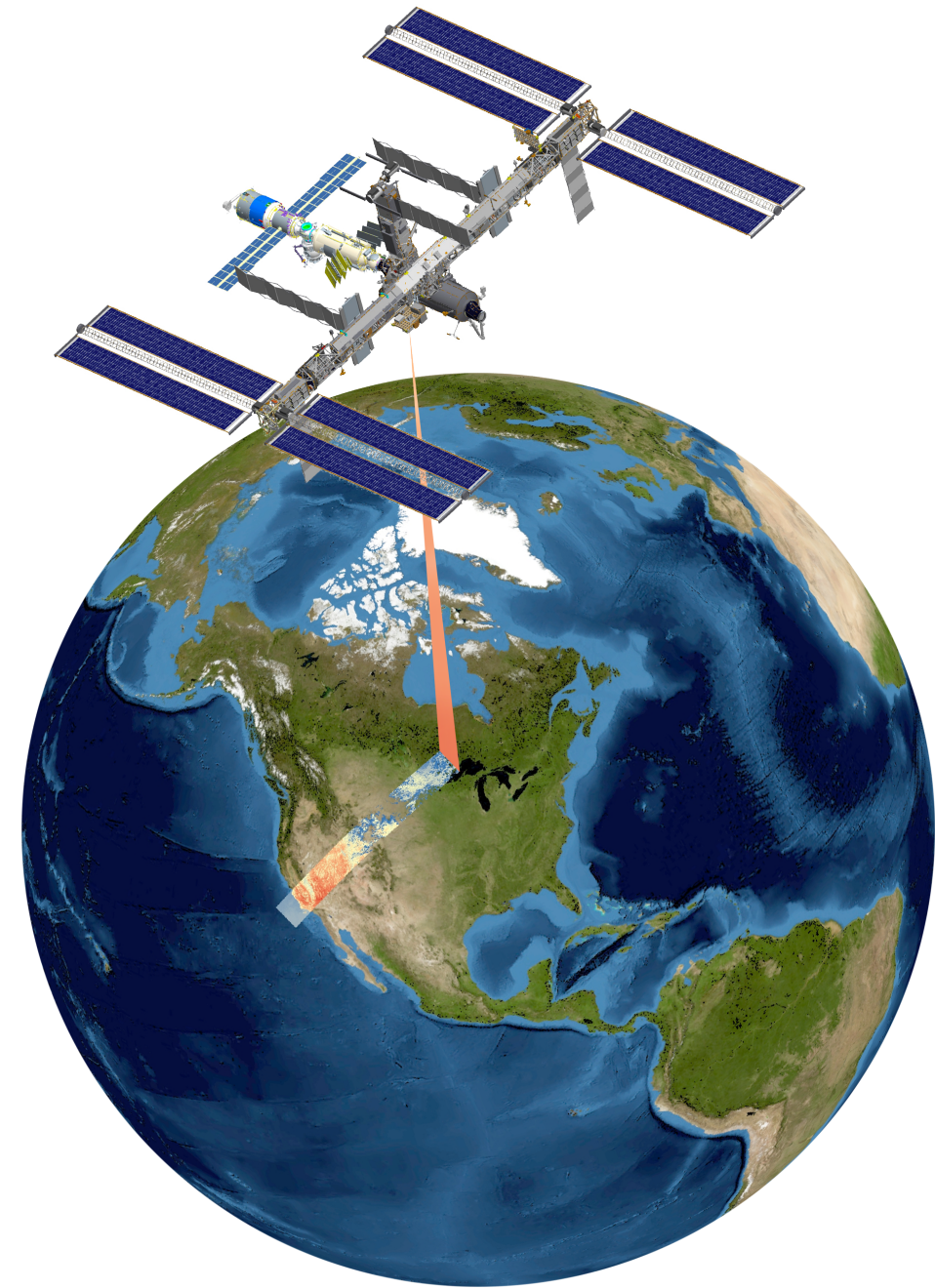
Hands-on Workshop for Accessing, Visualizing, and Analyzing ECOSTRESS Data

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U.S. Department of the Interior
U.S. Geological Survey



Wednesday, February 12, 2020

Outline

- Introductions
- ECOSTRESS Products
- E-Learning Materials and Resources
- AppEEARS
- AppEEARS Walk-through: Accessing ECOSTRESS data for a real-world use case
- Processing and quality filtering in Python: Jupyter Notebook
- Techniques for Visualizing ECOSTRESS Data in QGIS
- Making Maps in QGIS


LP DAAC Data Collections



Terra and Aqua
MODIS



S-NPP
VIIRS



Terra
ASTER



GED1



NASA
MEaSUREs



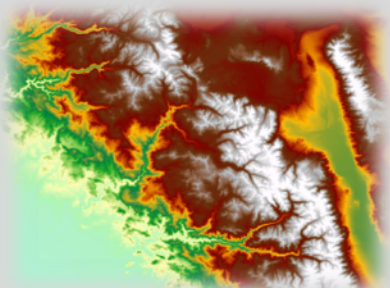
Community



ECOSTRESS



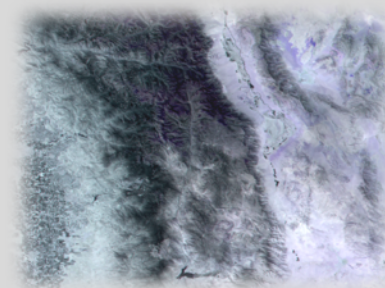
ECO1BATT.001



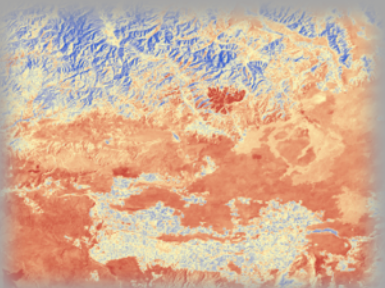
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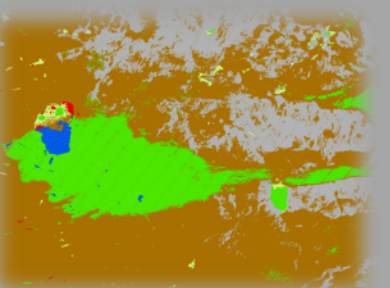
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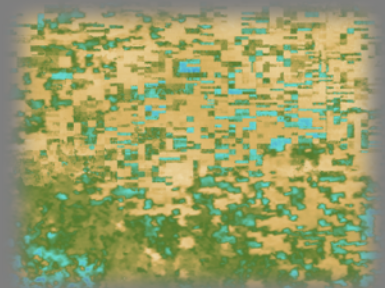
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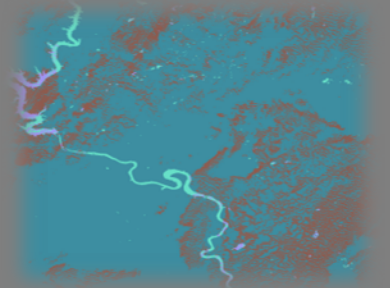
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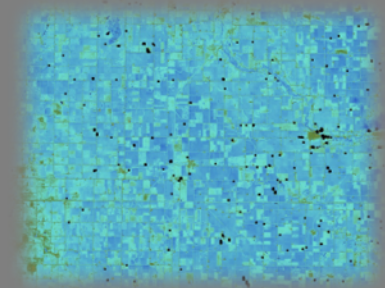
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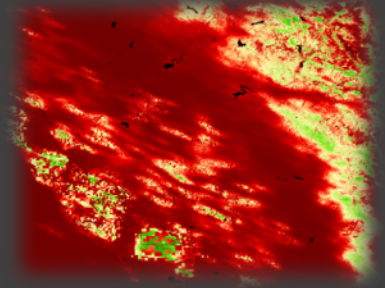
ECO3ETPTJPL.001



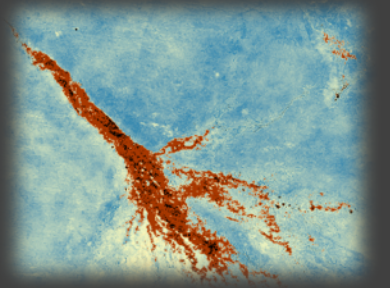
ECO3ANCQA.001



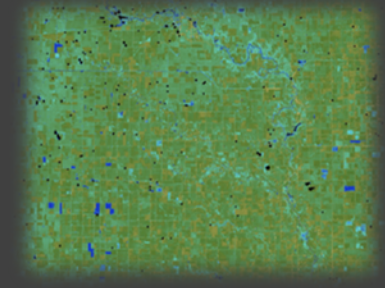
ECO3ETALEXIU.001



ECO4ESIPTJPL.001



ECO4WUE.001



ECO4ESIALEXIU.001

ECOSTRESS Products

LEVEL 1

LEVEL 2

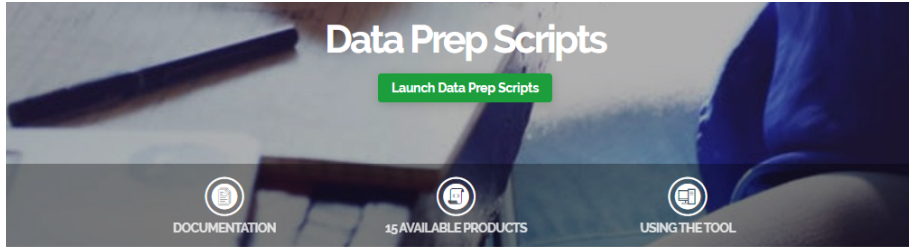
LEVEL 3

LEVEL 4

Coming Soon:

- ECO3ETALEXI
- ECO4ESIALEXI
- Gridded L2-L4 Products

LP DAAC Data Prep Scripts: <https://lpdaac.usgs.gov/tools/data-prep-scripts/>



[Homepage](#) / [Tools](#) / [Data Prep Scripts](#)

Description

This collection of R and Python scripts can be used to download data and perform basic data processing functions such as georeferencing, reprojecting, converting, and reformatting data. Scripts are available in Python and/or R and each have a README that provides additional information. All scripts are available for download from the [LP DAAC User Resources BitBucket Code Repository](#).

ECOSystem Spaceborne Thermal Radiometer Experiment on Space Station (ECOSTRESS)

- [ECOSTRESS Swath to Grid Conversion Script](#)

Advanced Spaceborne Thermal Emission and Reflection Radiometer (ASTER)

- [Convert ASTER L1T Radiance to Top of Atmosphere Reflectance](#)
- [Reformat and Georeference ASTER L1T HDF Files](#)

Visible Infrared Imaging Radiometer Suite (VIIRS)

- [Reformat and Georeference VIIRS Surface Reflectance HDF-EOS5 Files](#)

ASTER Global Emissivity Dataset (GED)

- [Convert ASTER GED V3 Science Datasets to Georeferenced GeoTiffs using R and Python](#)
- [Convert ASTER GED V4.1 Science Datasets to Georeferenced GeoTiffs using R and Python](#)

How to Download LP DAAC Data

- [How to Access the LP DAAC Data Pool with Python](#)
- [How to Access the LP DAAC Data Pool with R](#)

New Release:

- **Brightness Temperature conversion has been added to the ECOSTRESS_swath2grid.py script!**



LP DAAC Data User Resources / ECOSTRESS_swath2grid

Source

master ECOSTRESS_swath2grid /

Source	Description	Last Modified
ECOSTRESS_swath2grid.py	Updated package dependencies for Windows and corrected build 6.0 Fill Value issue	6 days ago
GDAL-2.3.2-cp36-cp36m-win_amd64.whl	New environment set up for windows	26 Oct 2018
h5py-2.8.0-cp36-cp36m-win_amd64.whl	New environment set up for windows	26 Oct 2018
macOS.yml	Changed mkl package version	12 Dec 2018
README.md	Updated list of layers for ECO3ANQQA.001	08 May 2019
WindowsEnvironment.zip	Updated package dependencies for Windows and corrected build 6.0 Fill Value issue	6 days ago
windowsOS.yml	Updated package dependencies for Windows and corrected build 6.0 Fill Value issue	6 days ago

[README.md](#)

ECOSTRESS Swath to Grid Conversion Script


Objective:


The ECOSTRESS_swath2grid.py script converts ECOSTRESS swath data products, stored in Hierarchical Data Format version 5 (HDF5, h5) into projected GeoTIFFs. When executing this script, a user will submit a desired output projection and input directory containing ECOSTRESS swath data products as command line arguments. The script begins by opening any of the ECOSTRESS products listed below that are contained in the input directory. Next, it uses the latitude and longitude arrays from the ECO18GEO product (except for L3/L4 ALEXI_USDA and ECO18MAPRAD products) to resample the swath dataset to a grid using nearest neighbor resampling (Pyresample/xcartree). Note that you will need to download the ECO18GEO files that correspond to your higher level product files. From there, the script defines the coordinate reference system (CRS) input by the user (options include UTM Zones and Geographic (EPSG:4326)). There is an optional argument to override the default UTM zone selected by the script (see below) if needed. Ultimately, the script exports the gridded array as a GeoTIFF (GDAL). By default, the script will loop through and perform the aforementioned steps for each science dataset (SDS) in the HDF5 file. There is an optional argument that allows you to select a subset of SDS layers within a given product (see details below). The resulting GeoTIFF files can be imported with spatial reference into GIS and Remote Sensing software programs. The script also will batch process all ECOSTRESS swath files contained in the input directory provided. For ECOSTRESS products that include a scale factor in the metadata, the output will be scaled, and for products that include a fill value in the file metadata, this will be carried over into the GeoTIFF outputs. For layers that do not contain a fill value in the file metadata, the fill value will be defined as the highest possible value for the given datatype of an SDS.


LP DAAC E-Learning: <https://lpdaac.usgs.gov/resources/e-learning/#ecostress>





[Homepage](#) / [Resources](#) / [E-Learning](#)

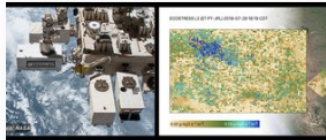

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Webinars

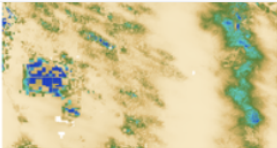


ECOSTRESS: NASA's Next-Generation Mission to Measure Evapotranspiration from the ISS

APRIL 2, 2019

- DATA POOL
- NASA EARTHDATA SEARCH
- DATA PREP SCRIPTS
- ECOSTRESS
- EVAPOTRANSPIRATION (ET)
- LAND SURFACE TEMPERATURE (LST)
- SURFACE RADIANCE

Video Tip



Hands-on Workshop for Accessing, Processing, and Analyzing ECOSTRESS Data

MARCH 27, 2019

- NASA EARTHDATA SEARCH
- DATA PREP SCRIPTS
- ECOSTRESS
- EVAPOTRANSPIRATION (ET)

Materials



Working with ECOSTRESS Evapotranspiration Data

MARCH 14, 2019

- DATA PREP SCRIPTS
- ECOSTRESS
- EVAPOTRANSPIRATION (ET)

Tutorial

Jupyter Notebook

Jupyter Notebook

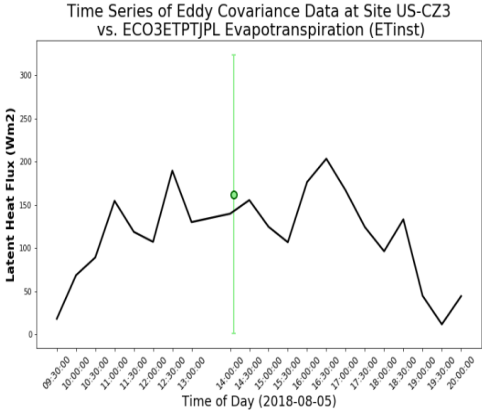
Finally, compare the ECOSTRESS Evapotranspiration and uncertainty with the time series of observations from the flux tower.

```
In [36]: # Set the figure size, create a subplot
fig = plt.figure(1, figsize=(12, 7))
ax = fig.add_subplot(111)

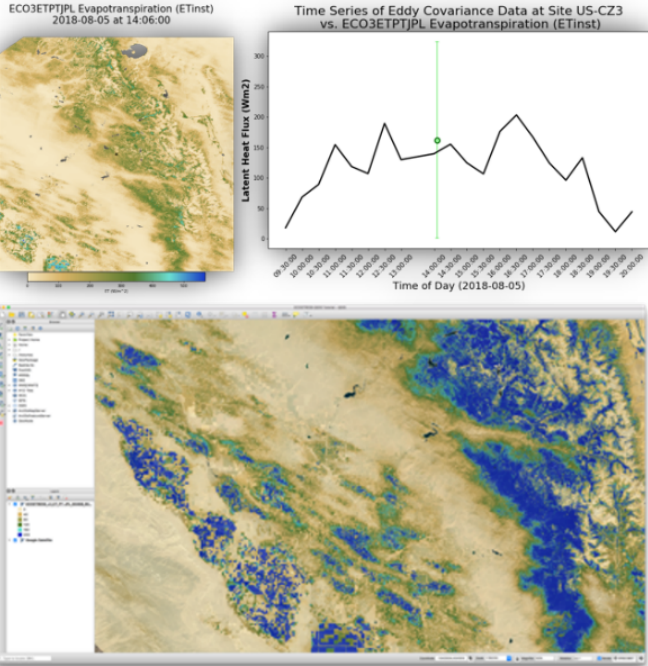
# Plot the flux tower observations followed by the ecostress median ET and median uncertainty
ax.plot(towerData.Time, towerData.LE, 'k', lw=2.5, color='black')
ax.plot(overpass, ETmedian, 'bo', ms=18, color='darkgreen')
ax.errorbar(overpass, ETmedian, yerr=ETmedian, lw=2.0, c='lightgreen', fct='o', capsize=3, capthick=2)

# Set x/y axes labels
ax.set_xlabel('Time of Day (date)', fontsize=18);
ax.set_xticks(np.array(towerData.Time));
ax.set_yticks(towerData.Time, rotation=45, fontsize=12);
ax.set_ylabel('Latent Heat Flux (Wm2)', fontsize=18, fontweight='bold')

# Add a title and export figure as png file
ax.set_title('Time Series of Eddy Covariance Data at Site US-CZ3 vs. (title) ({SOSname})', fontsize=22)
figure_filename = join(outDir, "{:}.vs.fluxtower.png".format(ecolame, SOSname))
print("figure filename: {}".format(figure_filename))
fig.savefig(figure_filename, bbox_inches='tight')
```



Workshop Materials



Provided in collaboration with the ECOSTRESS Science Team at JPL: <https://ecostress.jpl.nasa.gov/>

Website Demo:

<https://lpdaac.usgs.gov/>

EARTHDATA Find a DAAC - Feedback ?

USGS MISSION FOR A CHANGING WORLD **NASA**

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Search Data Catalog

What are you looking for... Search

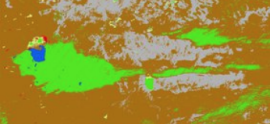
Temporal Range Collection Version Keyword Spatial Resolution (m) Temporal f >

COLLECTION: ECOSTRESS **TOOL: APPEARS** [Clear filters](#)

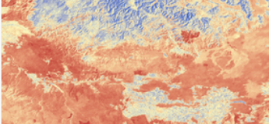
Showing 1 - 7 of 7 results Grid Cards List Sort by: Product Name



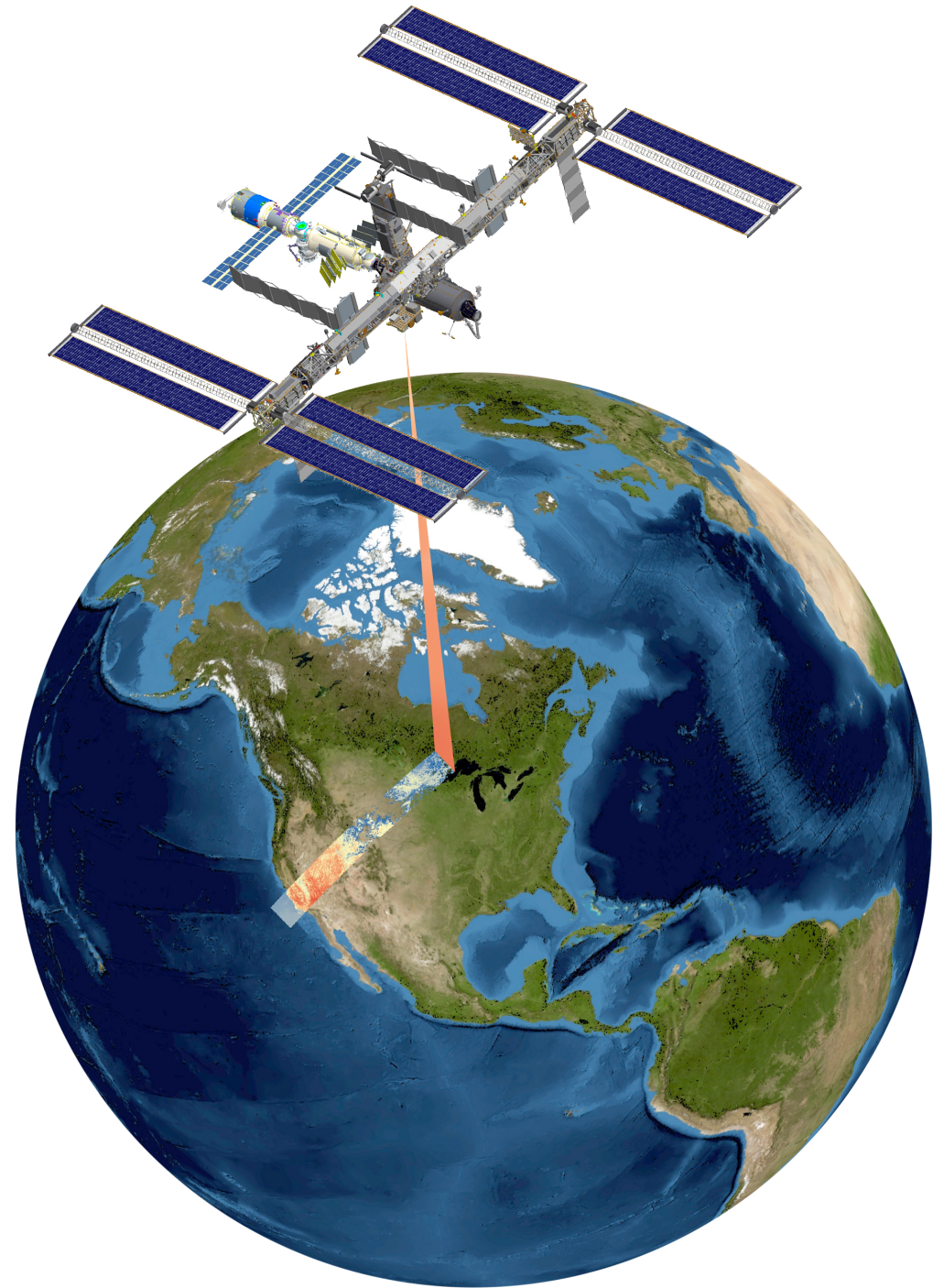
ECO1BGEO v001
ECOSTRESS Geolocation Daily L1B Global 70 m
ECOSTRESS **SURFACE RADIANCE**



ECO2CLD v001
ECOSTRESS Cloud Mask Daily L2 Global 70 m
ECOSTRESS **LAND COVER**



ECO2LSTE v001
ECOSTRESS Land Surface Temperature and Emissivity Daily L2 Global 70 m
ECOSTRESS **CROPLAND** **EMISSIONITY**
LAND SURFACE TEMPERATURE (LST)



ECOSTRESS Data in AppEEARS

Subset data:

- Spatially
- Temporally
- By band/layer
- Output options

Extract Area Sample

Enter a name to identify your sample
Kings County, CA ECOSTRESS

Upload a file or draw a polygon using the or icon
Drop a vector polygon file containing the area feature(s) to extract or [click here to select the file](#).
Supported file formats:
• ESRI Shapefile (.zip including .shp, .dbf, .prj, and .shx files)
• GeoJSON (.json or .geojson)

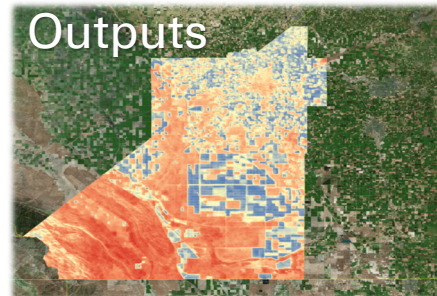
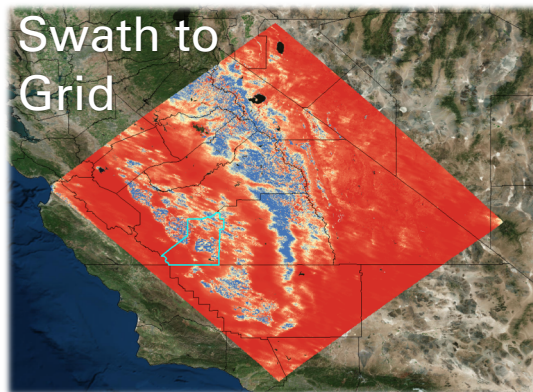
Start Date: 07-01-2018 End Date: 06-04-2019
☐ Is Date Recurring?

Select the layers to include in the sample
ECOSTRESS Land Surface Temperature & Emissivity (LST/EM)
ECOSTRESS_001_70m_ISS-dependent (2018-07-09 to Present)

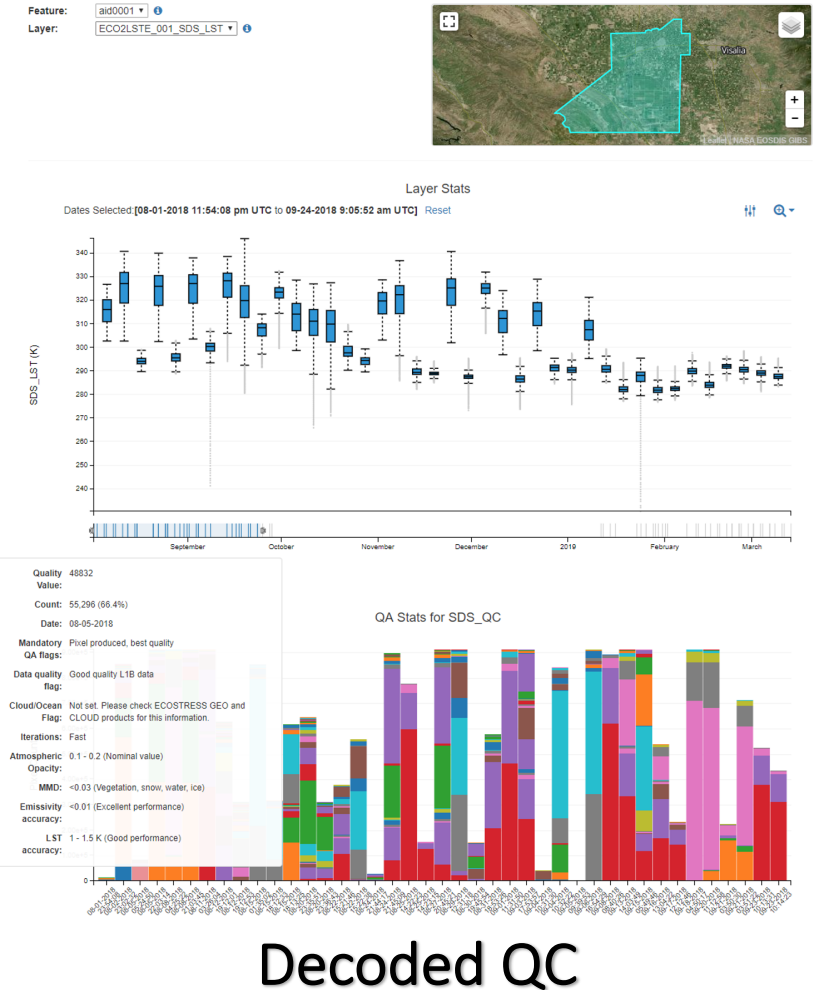
Selected layers
SDS_LST 70m, ISS-dependent

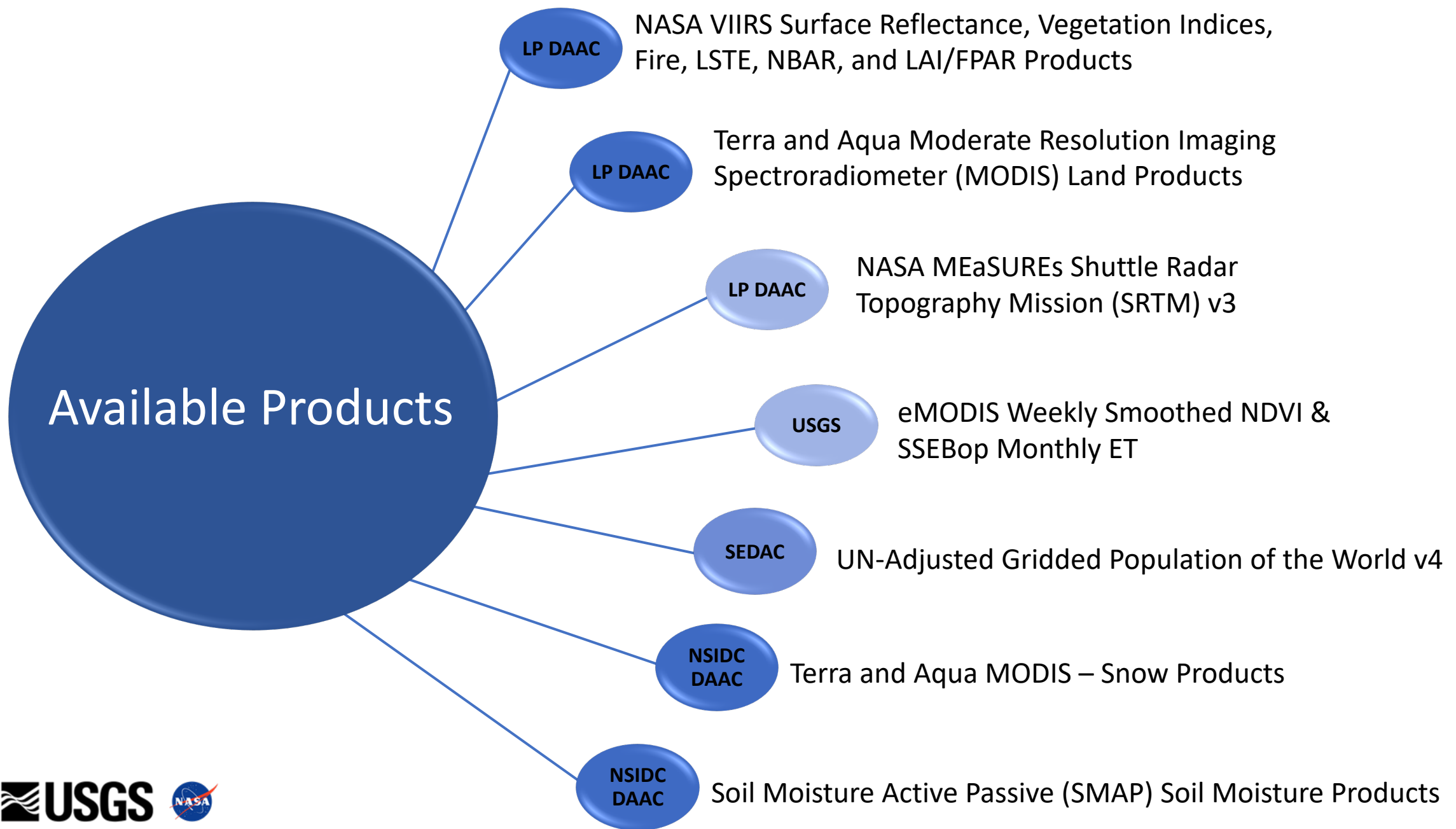
Output Options
File Format: GeoTiff
Projection: Geographic
Datum: WGS84
SRS: EPSG:4326
PROJ.4: proj=longlat +datum=WGS84 +no_defs

NOTE: Be aware that any reprojection of data from its source projection to a different projection will inherently change the data from its original format. All reprojections use GDAL's `gdalwarp` function in combination with the PROJ.4 string listed above. For additional information, see the AppEEARS help documentation.



Visualizations





Data Added in 2019:

- LP DAAC
 - ASTER GDEM V3
 - ECOSTRESS
- USGS
 - Landsat Analysis Ready Data (ARD)
- ORNL DAAC
 - Daymet (Gridded estimates of daily weather parameters)

Future Datasets:

- LP DAAC
 - GEDI
 - Additional S-NPP NASA Visible Infrared Imaging Radiometer Suite (VIIRS)
 - Additional MODIS Version 6.1 Data Products

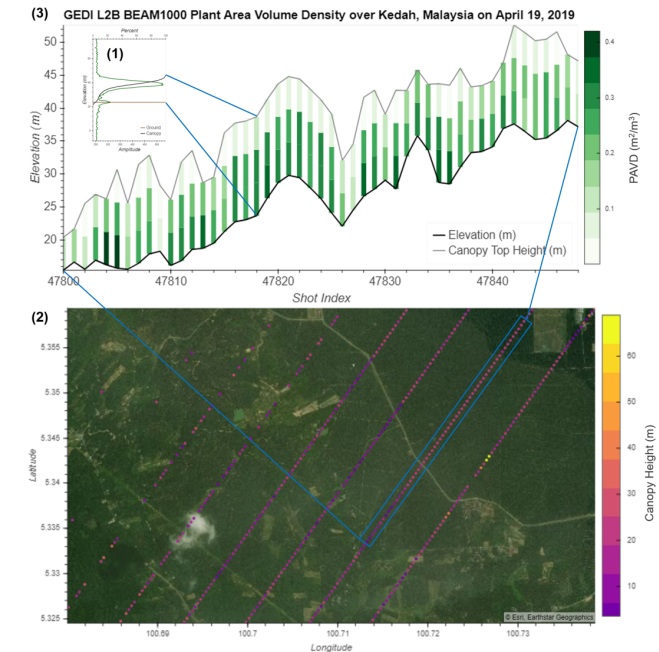
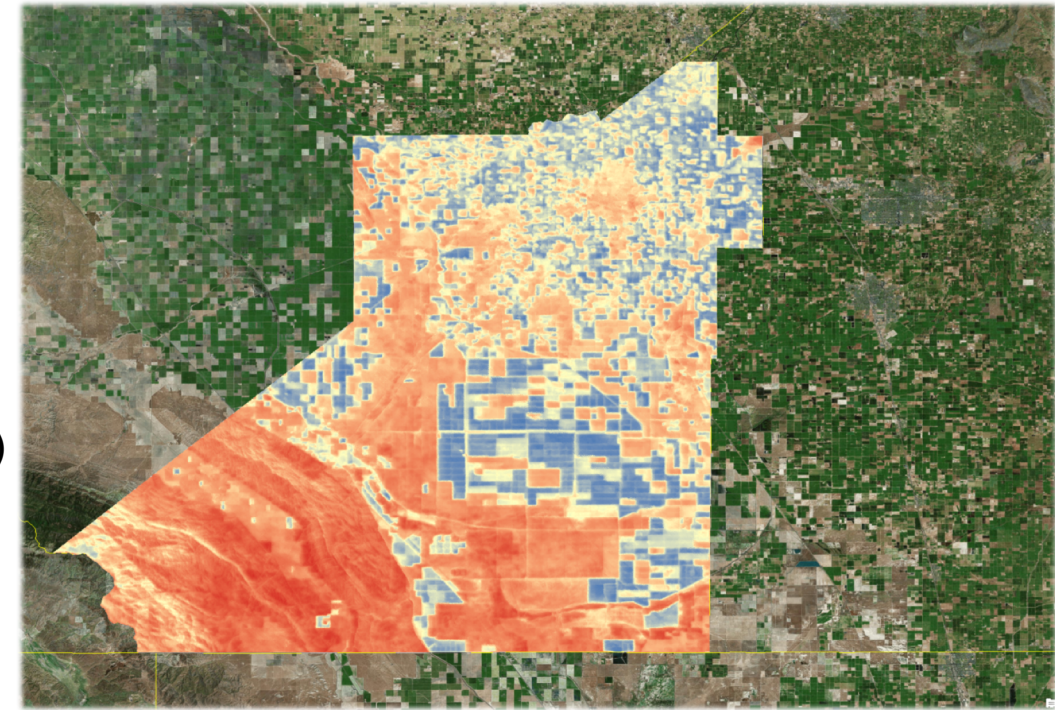
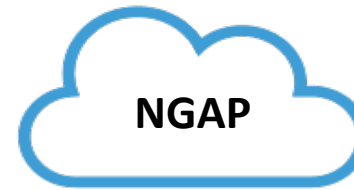
New Functionality:

- AppEEARS API
- AppEEARS to the Cloud
 - NASA-compliant General Application Platform (NGAP)

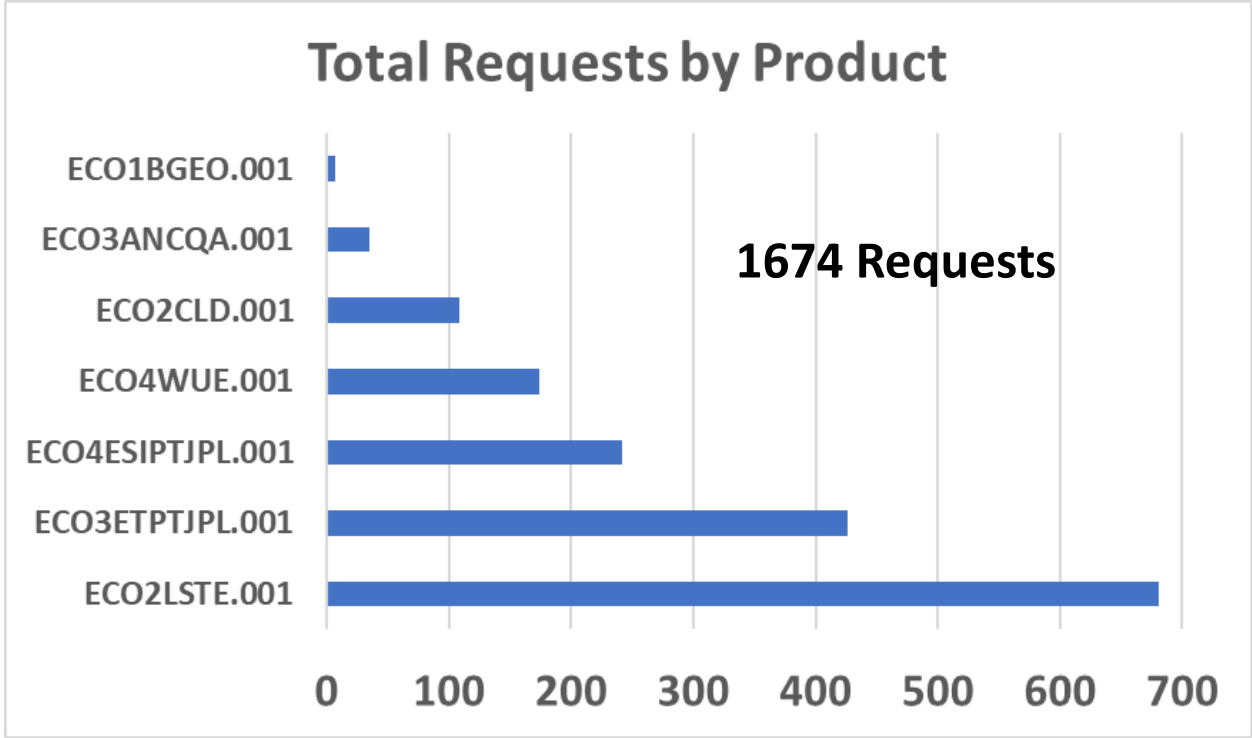
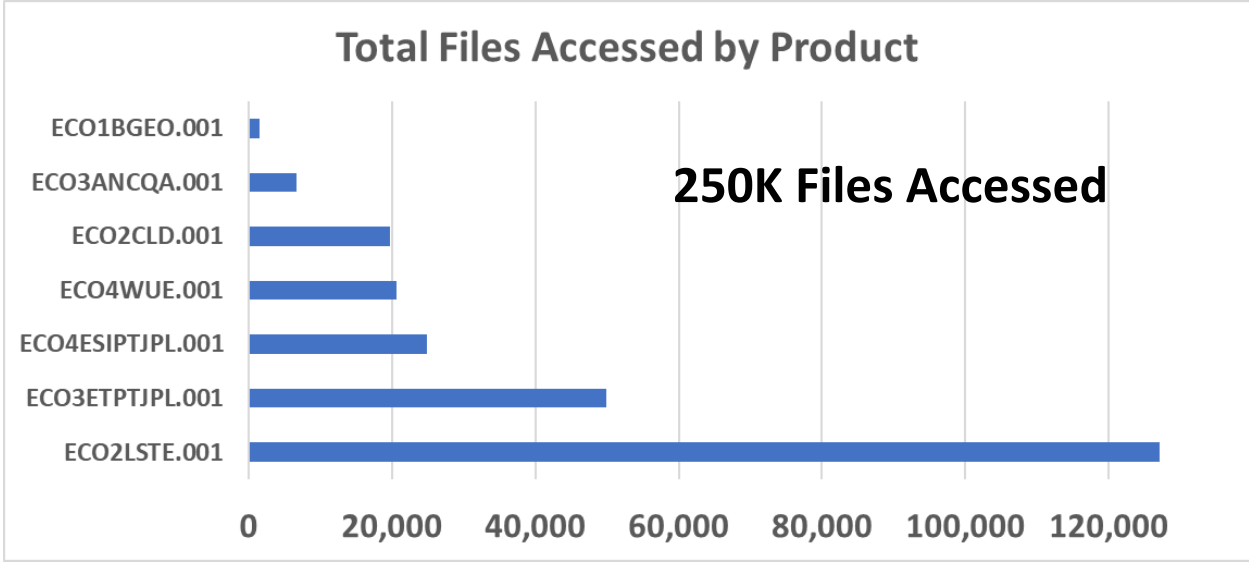
```
import json
import requests

# Load the task request from a file
with open("sample-request.json") as json_file:
    task = json.load(json_file)

# Submit the task request
token = token_response['token']
response = requests.post(
    'https://lpdaacsvc.cr.usgs.gov/appears/api/task',
    json=task,
    headers={'Authorization': 'Bearer (0).format(token))'})
task_response = response.json()
print(task_response)
```



ECOSTRESS in AppEEARS



Product	Volume of Granules Accessed (tb)	Volume Returned (tb)	% Reduction in Volume
ECO2LSTE.001	41.884	1.008	97.593
ECO3ETPTJPL.001	1.306	0.421	67.769
ECO4WUE.001	1.380	0.179	86.993
ECO4ESIPTJPL.001	0.362	0.080	77.929
ECO1BGEO.001	120.485	0.008	99.994
ECO3ANCQA.001	1.221	0.002	99.850
ECO2CLD.001	0.324	0.001	99.576



272 Unique Users!

Area Use Case Example: Observing Plant Response to Changing Conditions using ECOSTRESS LST and ET

WHO: Researchers from UC-Santa Barbara

WHAT: Tasked with monitoring tree mortality and riparian habitat conditions in response to changing climatic conditions

WHERE: Riparian Areas along the Santa Clara River in California

WHY: To understand how resilient riparian forest stands are to drought

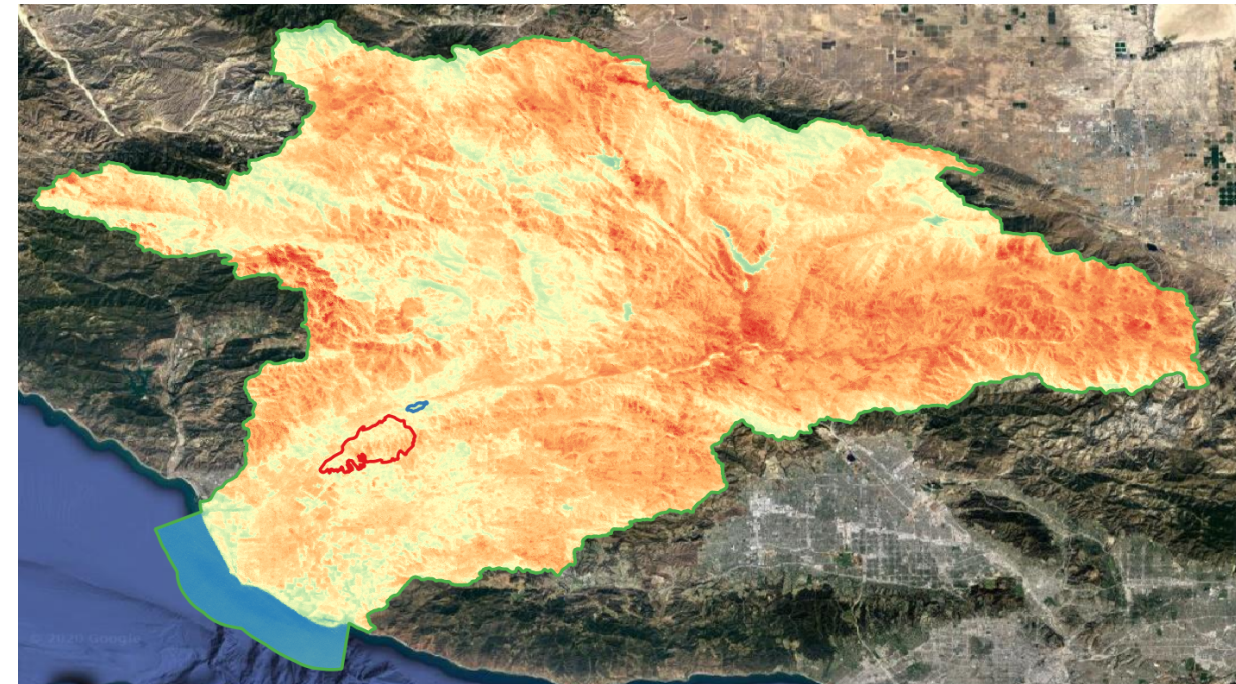
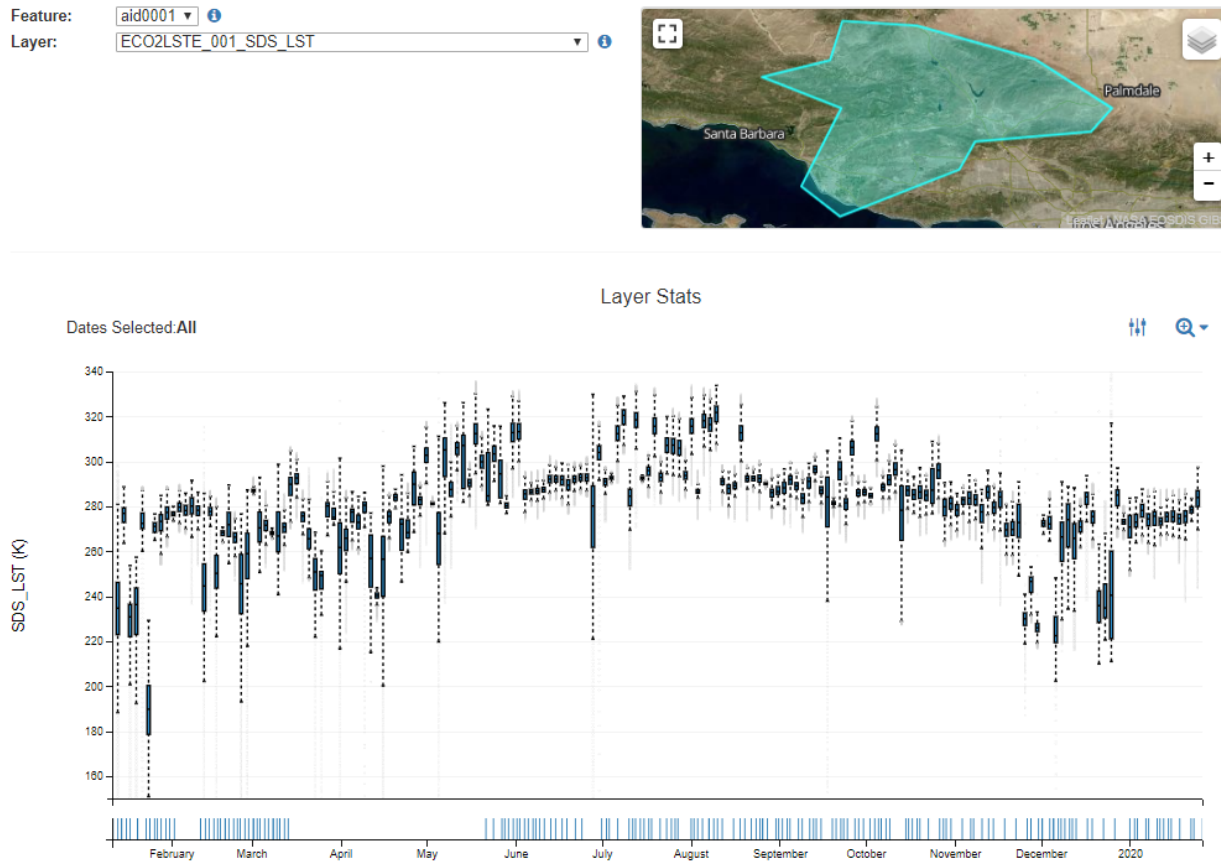
WHEN: August 2018

HOW: Extract time series of ECOSTRESS LST, ET, and Landsat 8 OLI and filter for highest-quality daytime images (clear sky, 9 am – 4 pm and low VZA) to do image comparison and use Landsat 8 to generate mixing model outputs of green vegetation (GV), non-photosynthetic vegetation (NPV), and soil fraction

 **Problem:** Need to find efficient strategy to filter highest quality ECOSTRESS observations for comparison and combine with Landsat 8 OLI observations

Live Demo:

<https://lpdaacsvc.cr.usgs.gov/appeears/>



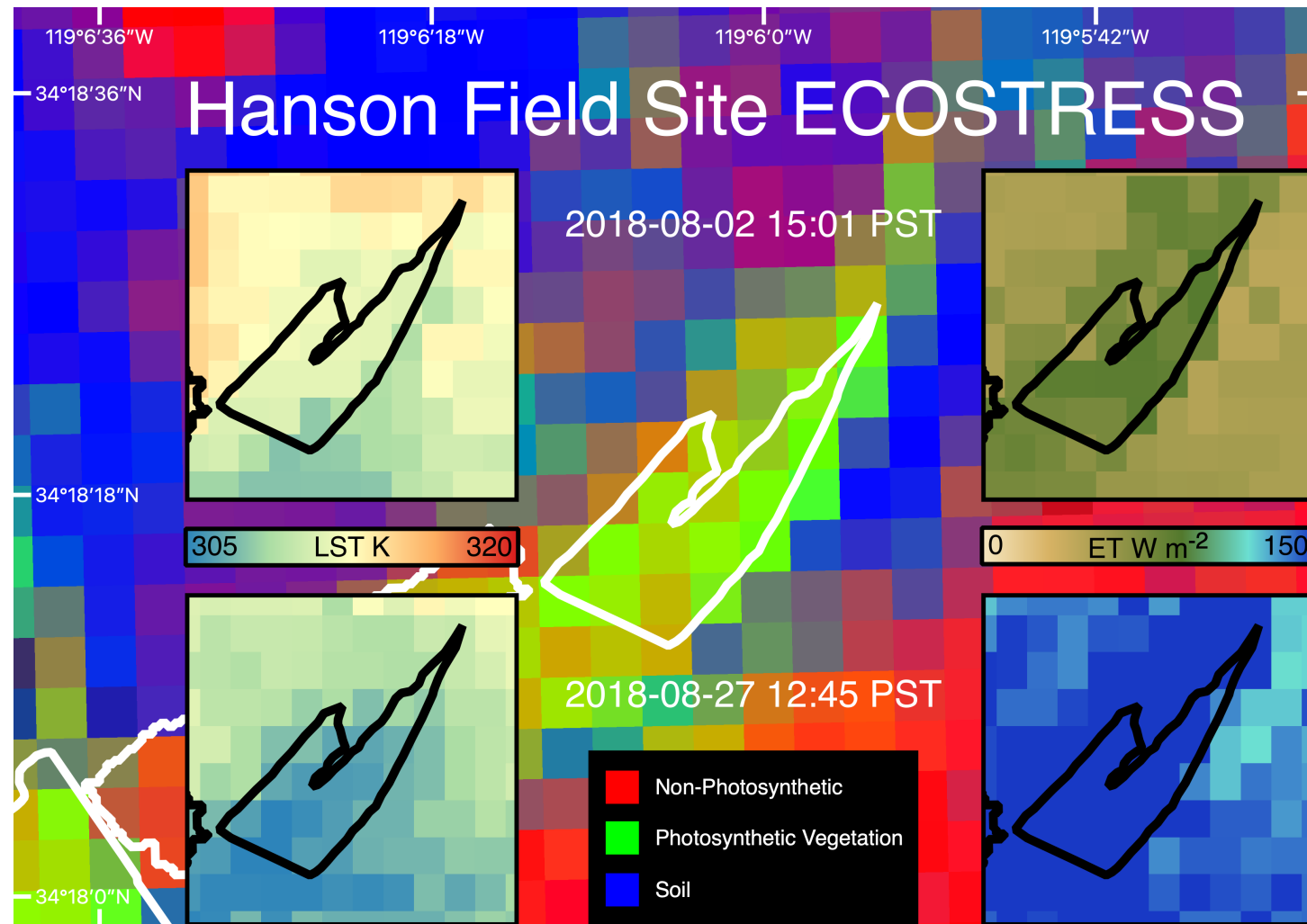
urs.earthdata.nasa.gov

Username: appeearstesting

Password: NASApixels2017



Working with ECOSTRESS Data in Python and QGIS



Questions?

- User Services
 - <https://lpdaac.usgs.gov/lpdaac-contact-us/>
- Try out AppEEARS:
 - <https://lpdaacsvc.cr.usgs.gov/appeears>
- Subscribe to the LP DAAC Listserv:
 - <https://lists.nasa.gov/mailman/listinfo/lpdaac>
- Tomorrow (Thurs) from 10:30 am – 12:30 pm: Office Hours