

## ARSET

Applied Remote Sensing Training

<http://arset.gsfc.nasa.gov>

 @NASAARSET

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# Remote Sensing of Drought

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July 12, 2017

Week 1

Speakers: Amber McCullum

Amita Mehta

Cynthia Schmidt

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# Course Structure

- Two, 2-hour sessions: Wednesday, July 12, and Wednesday, July 19
- Each session will be given twice:
  - Session A: 12:00 – 2:00 p.m. EDT (UTC-4)
  - Session B: 9:00 – 11:00 p.m. EDT (UTC-4)
- Presentations:
  - Demonstration of Drought Monitoring and Drought Data Access Tools
  - Drought Data Access
  - Drought Analysis Exercise with QGIS: Case Study, California
- Homework Exercise: Drought Monitoring Over Northern Africa
- Q and A after each session, and by email to instructors

# Homework and Certificates

- Homework
  - Answers must be submitted via Google Form
- Certificate of Completion:
  - Attend both webinars
  - Complete the homework assignment by the deadline (access from ARSET website)
    - HW Deadline: August 2<sup>nd</sup>
  - You will receive certificates approx. two months after the completion of the course from:  
[marines.martins@ssaihq.com](mailto:marines.martins@ssaihq.com)

Advanced Webinar: Remote Sensing of Drought

To be eligible for a certificate, this homework must be submitted by: date

Once you click submit, you will receive an email confirming your submission. You may click "View Your Score" to see how you did.

\* Required

Email address \*

Your email

Name \*

Your answer

1. What bands are used to calculate NDVI? \*

- Red and Green
- Red and Near-Infrared
- Infrared and Shortwave Infrared
- Green and Blue

National Aeronautics and Space Administration

NASA's Applied Remote Sensing Training Program (ARSET) presents a certificate of completion to «First\_Name» «Last\_Name» for completing:

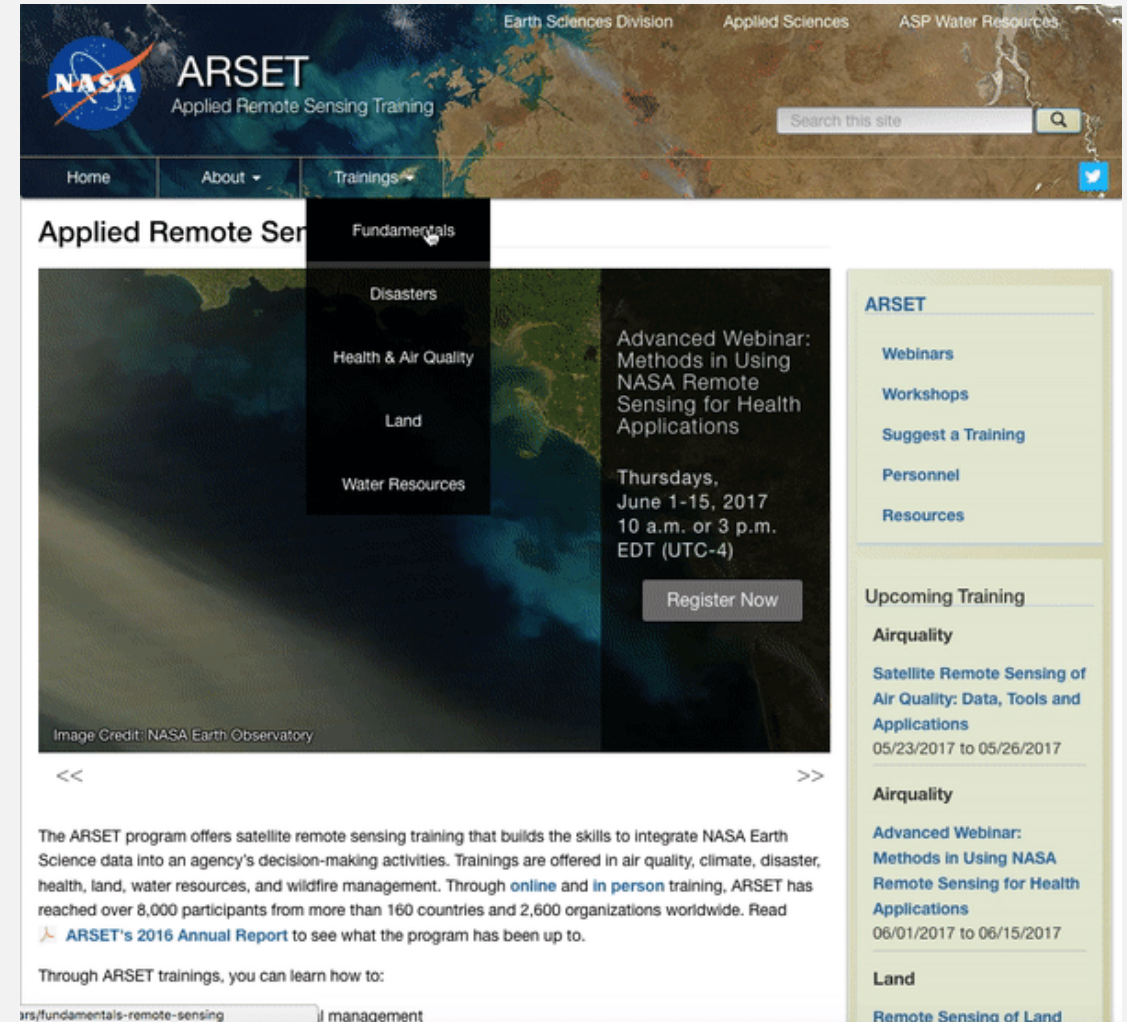
**Advanced Webinar: Remote Sensing of Drought**

July 12 – July 19, 2017

Trainers: Amber McCullum, Amita Mehta, and Cynthia Schmidt

# Prerequisites

- Fundamentals of Remote Sensing
  - Sessions 1, 2A, and 2B
  - On demand webinar, available anytime
  - <http://arset.gsfc.nasa.gov/webinars/fundamentals-remote-sensing>
- Download and install QGIS
  - <https://www.qgis.org/en/site/forusers/download.html>
  - Open software to ensure it is working properly



The screenshot shows the ARSET (Applied Remote Sensing Training) website. The header includes the NASA logo, the text 'ARSET Applied Remote Sensing Training', and navigation links for 'Earth Sciences Division', 'Applied Sciences', and 'ASP Water Resources'. A search bar is located in the top right. Below the header is a navigation menu with 'Home', 'About', and 'Trainings'. The 'Trainings' menu is open, showing options for 'Fundamentals', 'Disasters', 'Health & Air Quality', 'Land', and 'Water Resources'. The 'Fundamentals' option is selected, leading to a page for an 'Advanced Webinar: Methods in Using NASA Remote Sensing for Health Applications'. The webinar is scheduled for Thursdays, June 1-15, 2017, from 10 a.m. to 3 p.m. EDT (UTC-4). A 'Register Now' button is visible. The page also features a sidebar with 'ARSET' links for 'Webinars', 'Workshops', 'Suggest a Training', 'Personnel', and 'Resources'. Below this is a section for 'Upcoming Training' with entries for 'Airquality' and 'Land'. The main content area includes a paragraph about the ARSET program and a link to 'ARSET's 2016 Annual Report'.

# Course Material

Webinar recordings, presentations, in class exercises, and homework are available at: <http://arset.gsfc.nasa.gov/water/webinars/drought17/>



The screenshot shows the ARSET website interface. At the top, there is a navigation bar with the NASA logo and 'ARSET Applied Remote Sensing Training'. Below this is a search bar and a 'Search this site' button. The main content area is titled 'Advanced Webinar: Remote Sensing of Drought' and features a large satellite image of a drought-affected region. To the right of the image is a sidebar with links to 'Water Resources', 'Online Trainings', 'In-Person Trainings', and 'Applications'. Below the image, the dates and times for the webinar are listed: 'Dates: Wednesday, July 12, 2017 to Wednesday, July 19, 2017' and 'Times: 12:00-14:00PM EDT and 21:00-23:00 PM EDT (UTC-4)'. The sidebar also includes a section for 'Upcoming Training' with a link to 'Advanced Webinar: Methods in Using NASA Remote Sensing for Health Applications'.

## Course Agenda:

[Agenda.pdf](#)

### Remote Sensing-Based Drought Monitoring

July 12, 2017

This session will include an overview of drought classification, an introduction to web-based drought monitoring tools, a demonstration of drought data visualization tools, and end with an exercise for attendees to practice downloading data.

- [View the Recording »](#)
- [Presentation Slides \(English\) »](#)

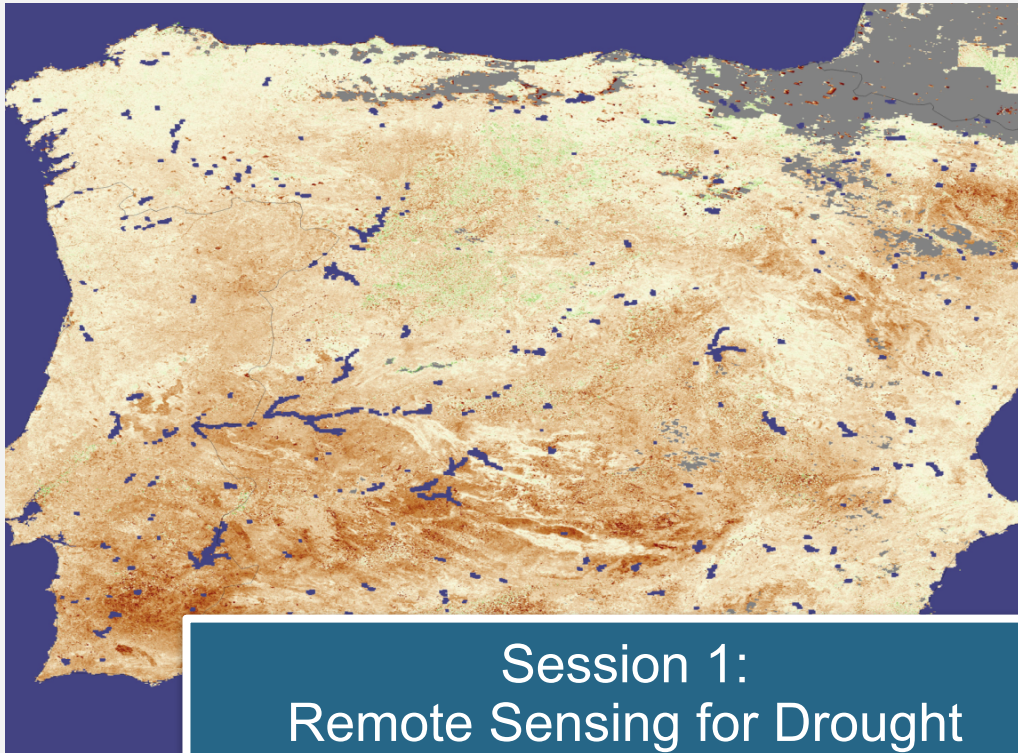
### Drought Monitoring Analysis and Application

July 19, 2017

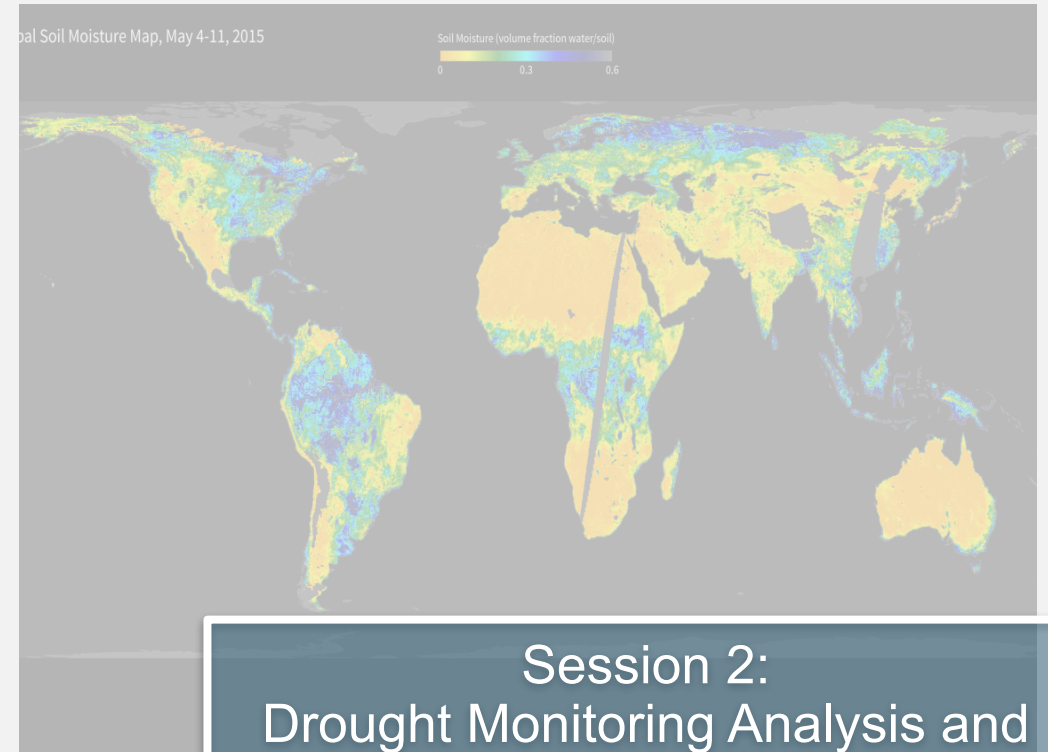
This session will include a demonstration of soil moisture, groundwater, NDVI, and evapotranspiration (ET) data access and visualization, and will use a case study (California) exercise to demonstrate how participants can analyze drought conditions. Background will also be provided for a case study (northern Africa) to be used by participants to independently conduct their own analysis.

- [View the Recording »](#)
- [Presentation Slides \(English\) »](#)
- [Homework Assignment »](#)

# Course Outline



Session 1:  
Remote Sensing for Drought  
Monitoring

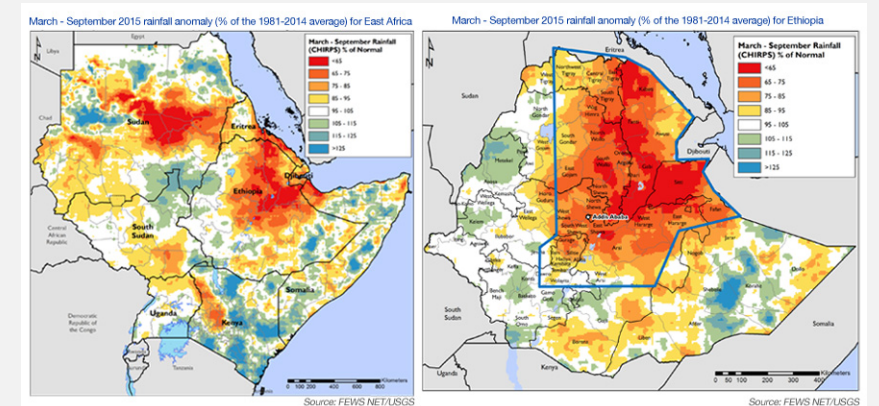
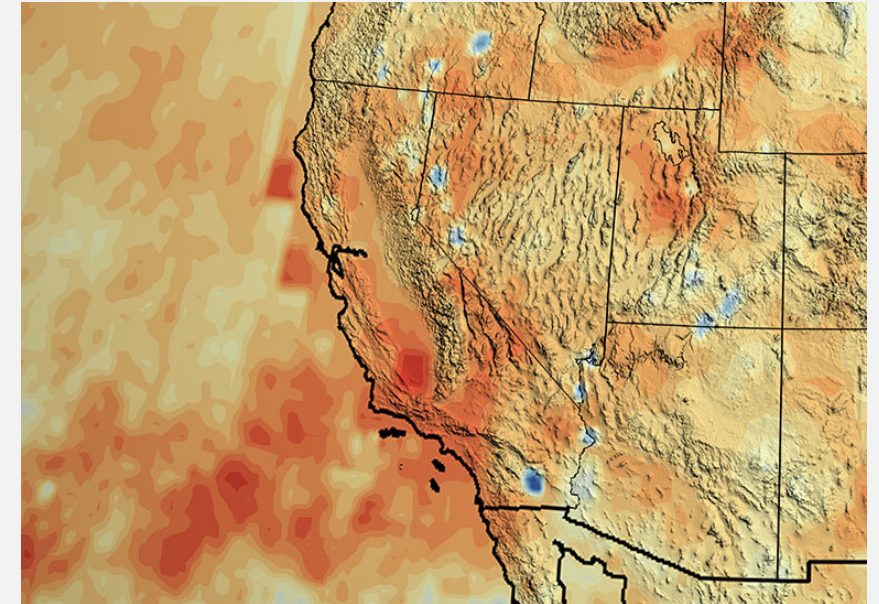


Session 2:  
Drought Monitoring Analysis and  
Application

# Session 1 Agenda

- Overview of Drought Classification
- Remote Sensing Data for Drought Monitoring
- Drought Monitoring with Precipitation
- Drought Monitoring with Vegetation
- Introduction and Demonstration of Web-Based Drought Monitoring Tools
- Exercise: Downloading Data for Drought Monitoring
  - Precipitation
  - NDVI

California's precipitation deficit from 2012-2014 via TRMM (NASA Global Climate Change) (Top); Famine Early Warning System rainfall anomalies, 2015 (right).





# Overview of Drought Classification

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# Types of Droughts

All droughts originate from “below normal” precipitation

- Meteorological Drought
- Agricultural Drought
- Hydrological Drought
- Socioeconomic Drought

Duration

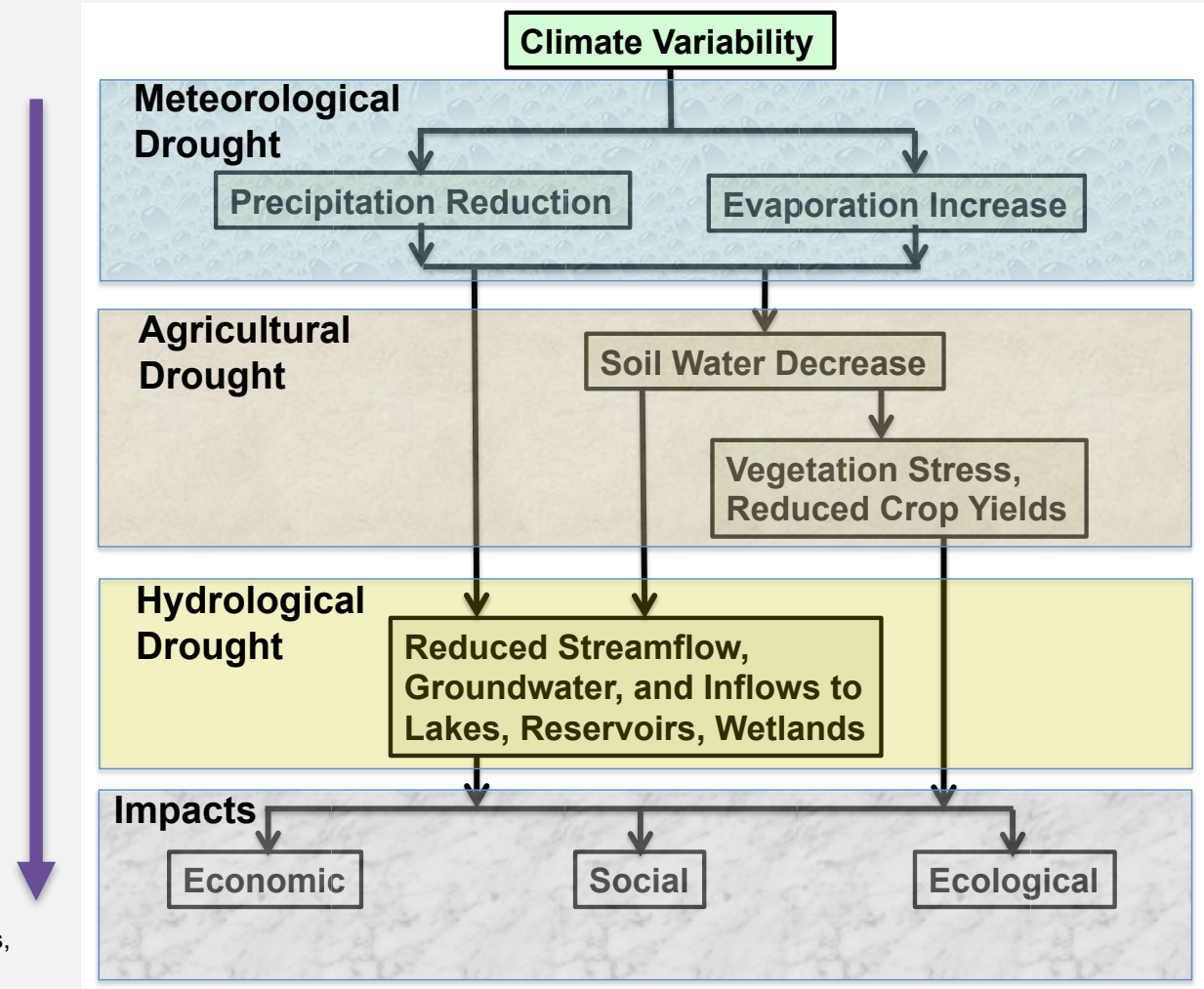
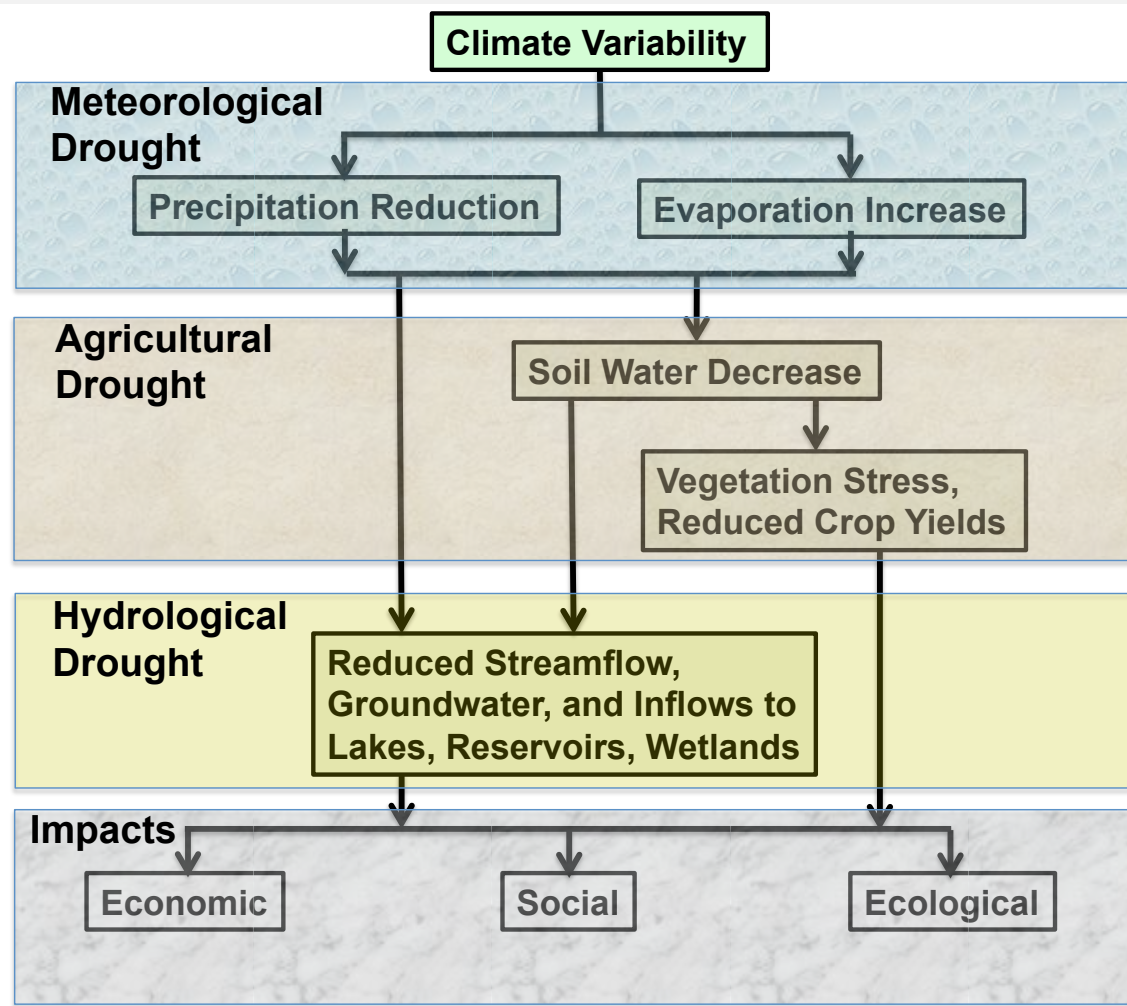


Image Credit: [National Drought Mitigation Center](#)

Wilhite, D.A.; and M.H. Glantz. 1985. Understanding the Drought Phenomenon: The Role of Definitions. *Water International* 10(3):111–120

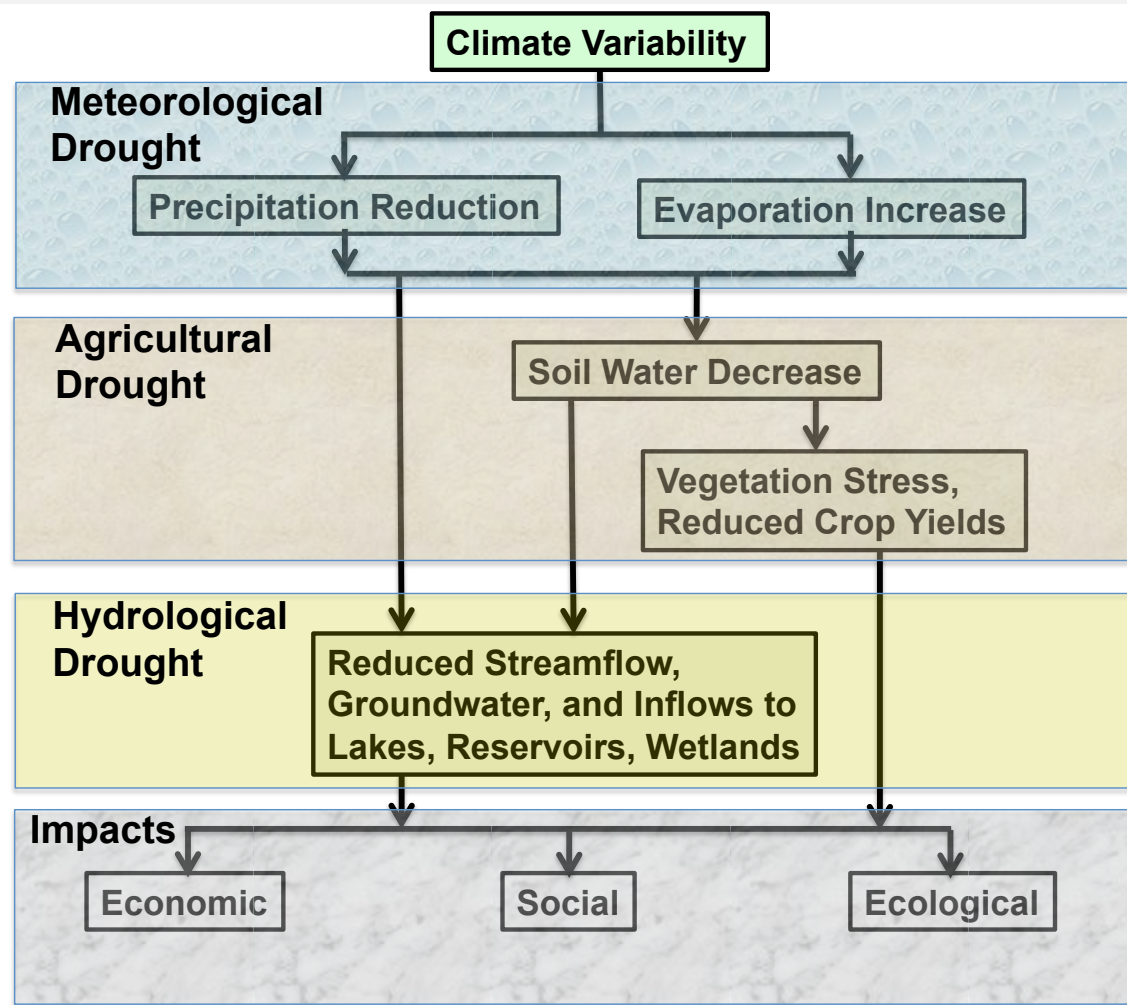
Figure: Mehta, V.M., 2017: Natural Decadal Climate Variability: Societal Impacts. CRC Press, Boca Raton, Florida, 326 pp.

# Types of Droughts



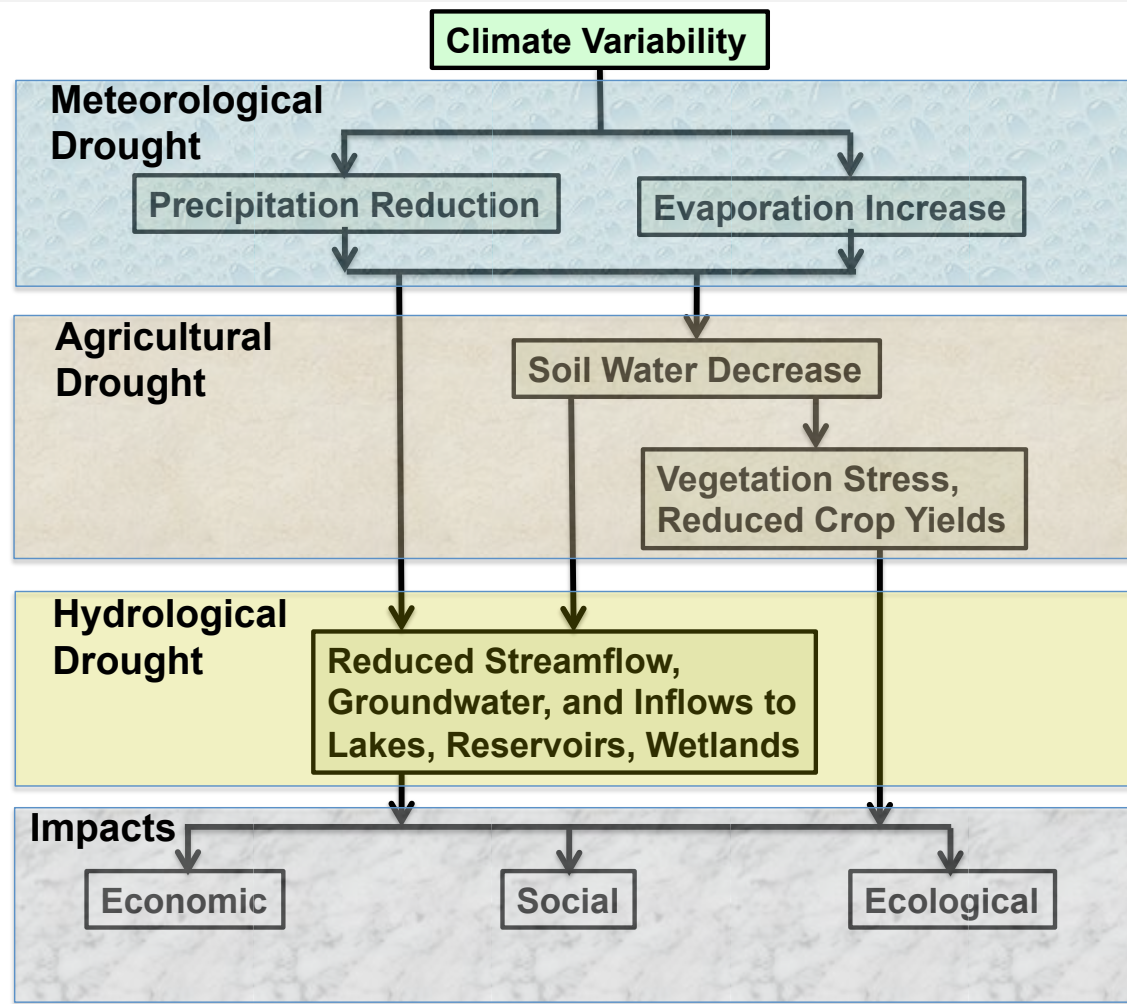
- Meteorological Drought
  - related to degree of dryness compared to ‘normal’ precipitation
  - region-specific and high spatial variability
- Agricultural Drought
  - related to various conditions like precipitation shortage, evapotranspiration and agricultural impact

# Types of Droughts



- Ecological Drought
  - prolonged and widespread deficit in naturally available water supplies that create multiple stresses across ecosystems
- Hydrological Drought
  - related to rain and snow shortfall
  - impact on surface and subsurface water supply
  - affects agricultural drought

# Types of Droughts



- Socioeconomic Drought
  - related to supply and demand rates of goods and economy
  - affected by agricultural, ecological, and hydrological
  - social and economic changes

A satellite-style map of a region, likely a basin or watershed, showing terrain in shades of brown and green. A large, semi-transparent light gray rectangular box is overlaid on the center of the map. Inside this box, the text "Remote Sensing Data for Drought Monitoring" is written in a bold, black, sans-serif font. Below the text, a solid black horizontal line extends from the left edge of the box towards the right.

# Remote Sensing Data for Drought Monitoring

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# NASA Satellites for Drought Monitoring



- Landsat: 07/1972 – present
- Tropical Rainfall Measuring Mission (TRMM): 11/1997 – 04/2015
- Global Precipitation Measurements (GPM): 02/2014 – present
- Terra: 12/1999 – present
- Aqua: 05/2002 – present
- Soil Moisture Active Passive (SMAP): 01/2015 – present
- Gravity Recovery and Climate Experiment (GRACE): 03/2002 – present

For detail information about the satellites and sensors see Session 2A and 2B on

<https://arset.gsfc.nasa.gov/webinars/fundamentals-remote-sensing>

# NASA Remote Sensing Data Available for Drought Monitoring

Type of Drought	Parameters	Satellites
Meteorological Drought	Precipitation	TRMM, GPM
Agricultural Drought	Normalized Difference Vegetation Index (NDVI), Evapotranspiration	Landsat, Terra, Aqua
Hydrological Drought	Soil Moisture, Ground Water	SMAP, GRACE

# NASA Remote Sensing Data Available for Drought Monitoring

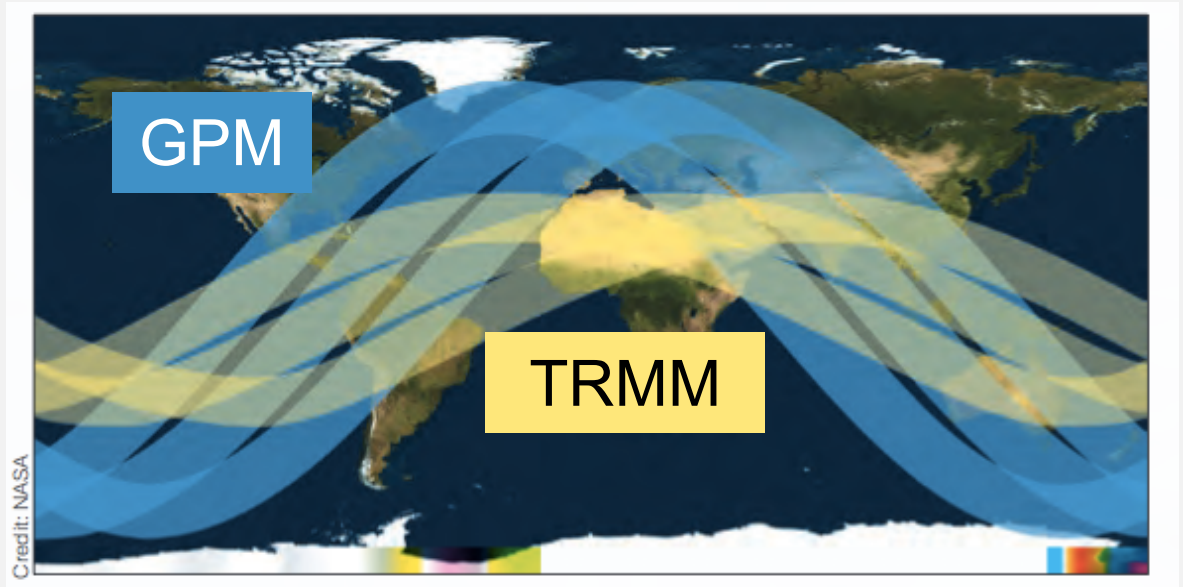
Type of Drought	Parameters	Satellites
Meteorological Drought	<b>Precipitation</b>	TRMM, GPM
Agricultural Drought	<b>Normalized Difference Vegetation Index (NDVI), Evapotranspiration</b>	Landsat, Terra, Aqua
Hydrological Drought	Soil Moisture, Ground Water	SMAP, GRACE

- We will analyze precipitation and NDVI data for drought monitoring
- We will learn to visualize soil moisture, evapotranspiration, and ground water anomalies for drought monitoring



# Precipitation from TRMM and GPM

- TRMM and GPM: NASA & JAXA (Japanese Space Agency) Joint Missions
- Both in non-polar, low-inclination orbits
- TRMM covered global tropics, between  $50^{\circ}\text{S} - 50^{\circ}\text{N}$
- GPM covers global tropics, between  $65^{\circ}\text{S} - 65^{\circ}\text{N}$
- TRMM Sensors:
  - **TMI, PR, VIRS**, LIS, CERES
- GPM Sensors:
  - GMI, DPR

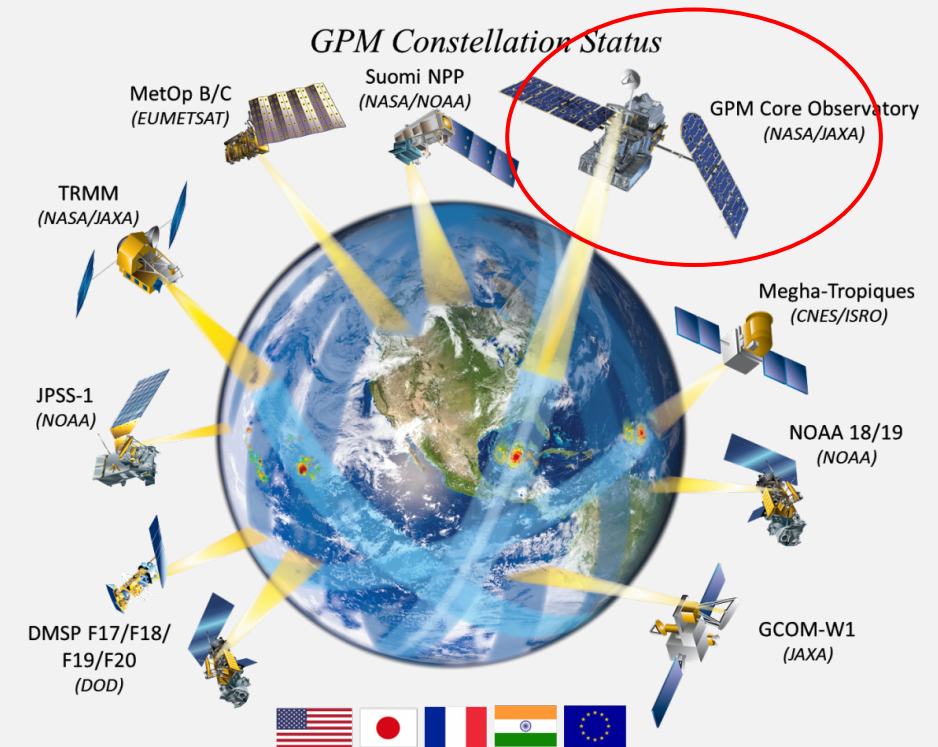


- TRMM: Nov 27, 1997 – Apr 15, 2015
- GPM: Feb 27, 2014 - present

# Multi-Satellite Algorithms for TRMM and GPM

<http://pmm.nasa.gov/science/precipitation-algorithms/>

- TRMM and GPM Core satellites are used to calibrate microwave observations from a constellation of satellites
- These multi-satellite algorithms allow improved spatial and temporal coverage of precipitation data and are widely used for applications
  - TRMM Multi-satellite Precipitation Analysis (TMPA)
  - Integrated Multi-satellite Retrievals for GPM (IMERG)



## References:

Huffman, G.J., R.F. Adler, D.T. Bolvin, G. Gu, E.J. Nelkin, K.P. Bowman, E.F. Stocker, D.B. Wolff, 2007: The TRMM Multi-satellite Precipitation Analysis: Quasi-Global, Multi-Year, Combined-Sensor Precipitation Estimates at Fine Scale. *J. Hydrometeorol.*, 8, 33-55. [MERG ATBD V4.5.pdf](#)

## TMPA and IMERG

	<b>TMPA</b>	<b>IMERG</b>
Spatial Resolution	0.25° x 0.25°	0.1° x 0.1°
Spatial Coverage	Global, 50° S-50°N	Global, 60°S-60°N (will be extended from pole to pole)
Temporal Resolution	3 hours	30 minutes
Temporal Coverage	1/1998 – Present	3/1/2014 – Present

- Since April 8, 2015, TRMM climatological calibration is used to generate TMPA
- TMPA is available for more than 17 years and is used for drought monitoring
- TMPA and IMERG combined data will be available in early 2018 at IMERG data resolution

# TRMM and GPM Data

Precipitation Measurement Missions: <http://pmm.nasa.gov/>

NASA NATIONAL AERONAUTICS AND SPACE ADMINISTRATION | GODDARD SPACE FLIGHT CENTER

## PRECIPITATION MEASUREMENT MISSIONS

Home GPM TRMM Science Applications Meetings Data Access Resources Education

### The Art of Creating Digital Hurricanes

Every day, scientists at NASA work on creating better hurricanes – on a computer screen. At NASA’s Goddard Space Flight Center in Greenbelt, Maryland, a team of scientists spends its days incorporating millions of atmospheric observations, sophisticated graphic tools and lines of computer code to create computer models simulating the weather and climate conditions responsible for hurricanes. Scientists use these models to study the complex...

**FEATURED ARTICLES** 1 2 3 4 5

### TRMM

**TROPICAL RAINFALL MEASURING MISSION**

TRMM operated from 1997 - 2015 and carried the first on-orbit active/passive instruments to study tropical rainfall. **3B42\* data will continue through mid-2017 ...more**

### GPM

**GLOBAL PRECIPITATION MEASUREMENT**

An international satellite mission launched by NASA and JAXA on Feb. 27, 2014, that is setting new standards for precipitation measurements worldwide using a network of satellites united by the GPM Core Observatory. [Get data](#)

**LATEST HALF-HOURLY PRECIPITATION**

**EXTREME WEATHER NEWS**

- Home to all information related to TRMM and GPM
- Links to Level-1 to Level-3 data via multiple web-based tools

# TMPA Data

<http://pmm.nasa.gov/data-access/downloads/trmm/>

- Multiple web tools for data download
- We will use Giovanni to download TMPA monthly precipitation data for drought monitoring
  - <http://giovanni.gsfc.nasa.gov/giovanni>

▼ 3B42 RT: 3-Hour Realtime TRMM Multi-satellite Precipitation Analysis

The system to produce the "TRMM and Other Data" estimates in real time was developed to apply new concepts in merging quasi-global precipitation estimates and to take advantage of the increasing availability of input data sets in near real time. The overall system is referred to as the real-time TRMM Multi-Satellite Precipitation Analysis (TMPA-RT), and is currently in Version 7.

**Documentation:**

- Real-Time TRMM Multi-Satellite Precipitation Analysis Data Set Documentation (updated 4/19/17)
- Transitioning from TMPA (3B42x) to IMERG and Dataset Comparison

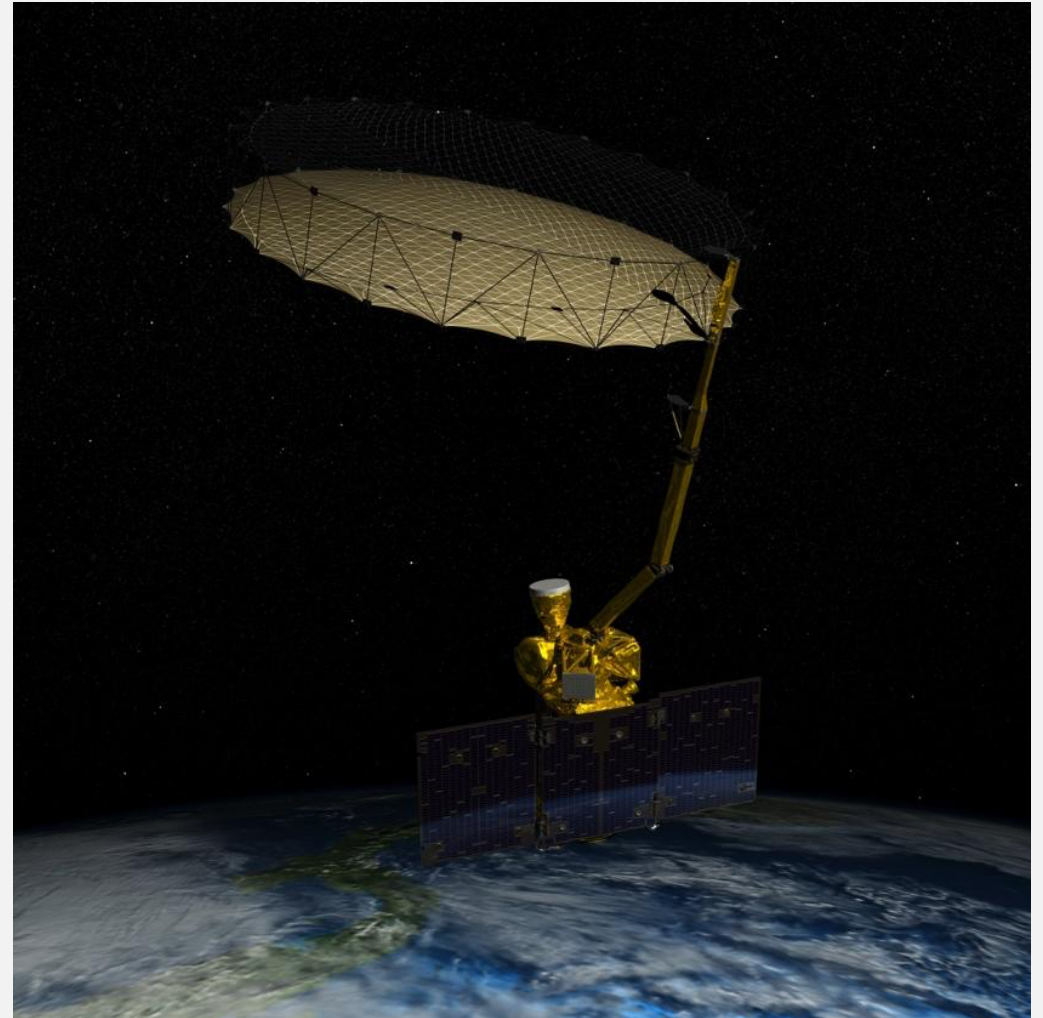
Resolution	Regions - Dates	Latency	Format	Source	DL
0.25°, 3-hour	Latitudes 60°N-S, March 2000 to present	8 Hours (realtime)	binary3B4X RT (page 10, Section 4)	FTP (PPS) *	↓
			binary3B4X RT (page 10, Section 4)	THORonline (PPS)	↓
			NetCDF	HTTPS (GES DISC)	↓
			TIFF + Wordfile	FTP (PPS) *	↓
			Giovanni	Giovanni	↓
			GDS	GrADS Data Server (GDS)	↓
			OPeNDAP	OPeNDAP	↓

3B42RT Derived Imagery

# Soil Moisture Active Passive (SMAP) Mission

<http://smap.jpl.nasa.gov/>

- January 31, 2015 - present
- Polar orbit
- Global coverage every 2-3 days
- Swath width: 1,000 km
- SMAP Sensors:
  - Microwave Radiometer
  - Microwave Radar
    - currently unavailable

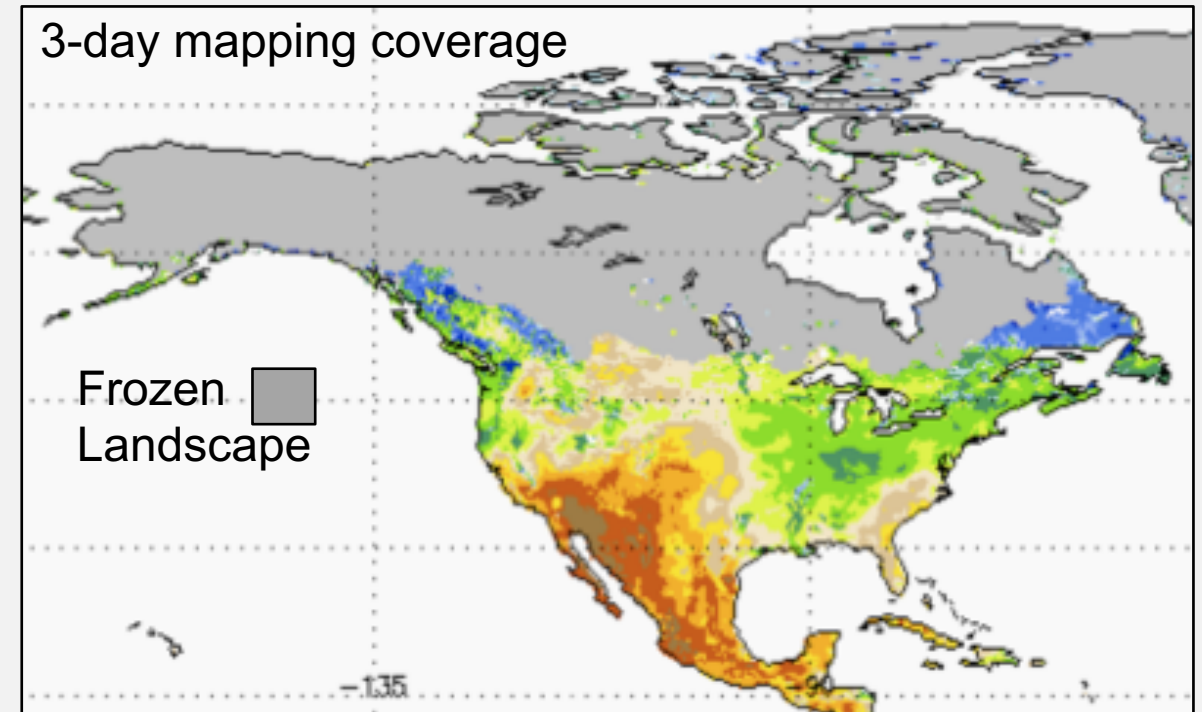


# SMAP Microwave Data

<http://smap.jpl.nasa.gov/data/>

- Radiometer-based soil moisture (L2\_SM-P)
  - Resolution: 36 km
  - 3 day global coverage
- Root Zone Soil Moisture (SMAP L4\_SM)
  - SMAP observations assimilated in a land surface model
  - Resolution: 9 km
  - 3 hourly & 7 day coverage

- measures the moisture in the top 5 cm of soil



# Access to SMAP Data: National Snow & Ice Data Center

<http://nsidc.org/data/search/#keywords=soil+moisture/>

National Snow & Ice Data Center

DATA RESEARCH NEWS ABOUT

SEARCH Web pages

Soil Moisture Active Passive Data (SMAP)  
NASA SMAP data at the NSIDC DAAC. [Read more...](#)

Scientific Data for Research

Glaciers Ice Sheets Ice Shelves Permafrost Sea Ice Soil Moisture Snow Search for more

Showing 1-25 of 236 Data Sets

Sort by: Relevance (highest to lowest) Per page: 25

Parameter

Filter Parameters

- Active Layer (20)
- Aerosols (2)
- Air Temperature (40)
- Albedo (4)
- Altitude (2)
- Antenna Temper... (1)
- Atmospheric Ch... (4)
- Atmospheric Pre... (18)
- Atmospheric Pro... (28)

Spatial Coverage

- Show Global Only (25)

Temporal Duration

- < 1 year (164)
- 1+ years (68)
- 5+ years (32)
- 10+ years (22)
- Not specified (4)

Format

- ASCII Text (128)
- Binary (25)
- Documents (13)
- ESRI Shapefile (3)
- GRIB (1)

**SMAP L3 Radar Global Daily 3 km EASE-Grid Soil Moisture** [Get Data](#)

Temporal Coverage 2015-04-13 to 2015-07-07  
Parameter Sigma Nought | Soil Moisture  
Data Format HDF5  
Summary This Level-3 (L3) soil moisture product provides a composite of daily estimates of global land surface conditions retrieved by the Soil Moisture Active Passive (SMAP) radar at ... [More Detail](#)

**SMAP L2 Radar Half-Orbit 3 km EASE-Grid Soil Moisture** [Get Data](#)

Temporal Coverage 2015-04-13 to 2015-07-07  
Parameter Sigma Nought | Soil Moisture  
Data Format HDF5  
Summary This Level-2 (L2) soil moisture product provides estimates of global land surface conditions retrieved by the Soil Moisture Active Passive (SMAP) active radar during 6:00 a.m. ... [More Detail](#)

**SMAP L3 Radiometer Global Daily 36 km EASE-Grid Soil Moisture** [Get Data](#)

Temporal Coverage 2015-03-31 to continuous  
Parameter Brightness Temperature | Soil Moisture  
Data Format HDF5  
Summary This Level-3 (L3) soil moisture product provides a composite of daily estimates of global land surface conditions retrieved by the Soil Moisture Active Passive (SMAP) passive ... [More Detail](#)

**SMAP L2 Radiometer Half-Orbit 36 km EASE-Grid Soil Moisture** [Get Data](#)

Temporal Coverage 2015-03-31 to continuous  
Parameter Brightness Temperature | Soil Moisture  
Data Format HDF5  
Summary This Level-2 (L2) soil moisture product provides estimates of global land surface conditions retrieved by the Soil Moisture Active Passive (SMAP) passive microwave radiome ... [More Detail](#)

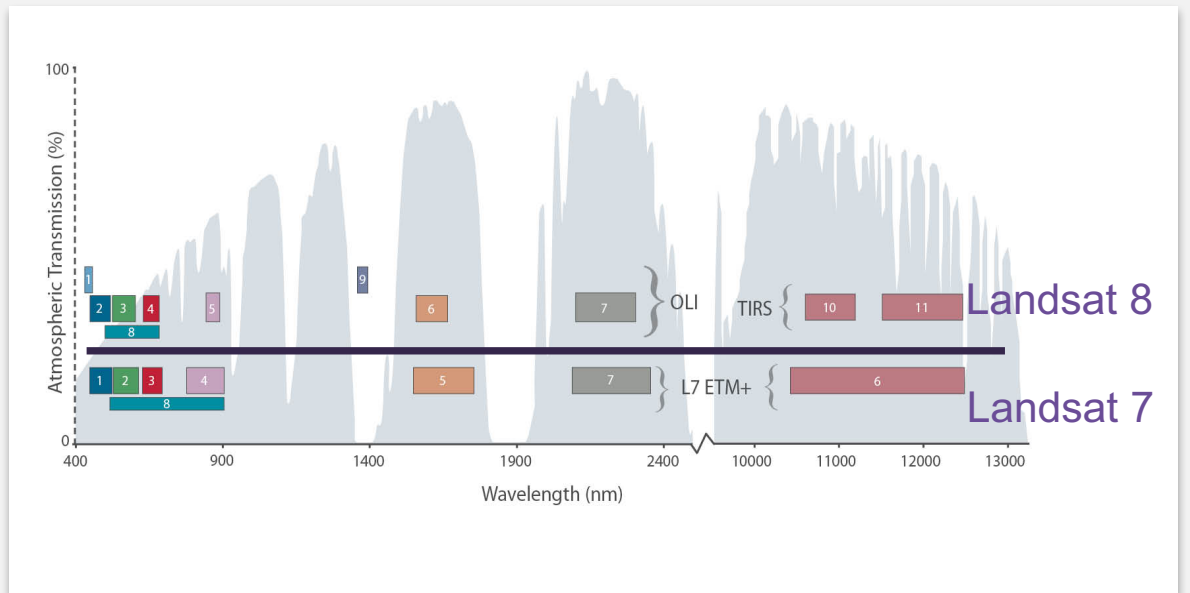
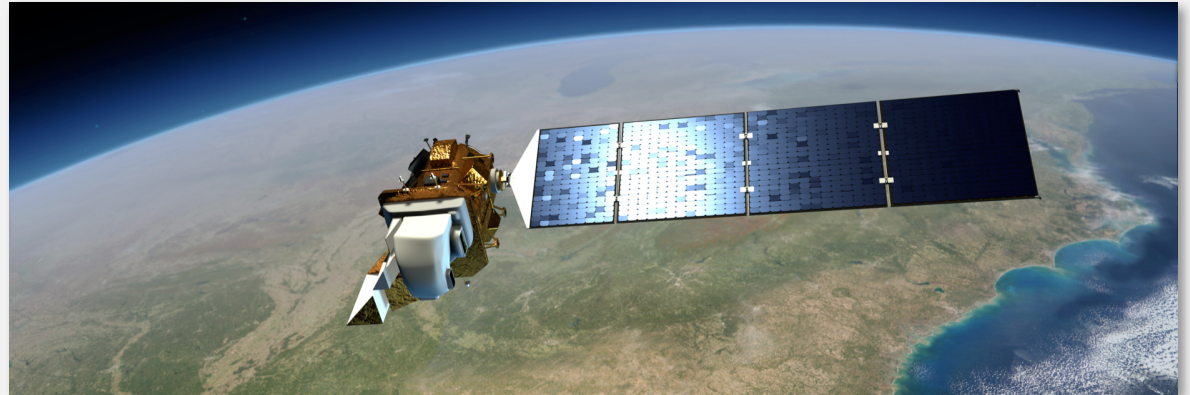
**SMAP L4 9 km EASE-Grid Surface and Root Zone Soil Moisture Geophysical Data** [Get Data](#)

Level 2 to Level 4 data



# Landsat Overview

- First Landsat launched in 1972
- Landsat 8 launched in 2013
- NASA created and launched
  - USGS maintains data
- Passive sensor: obtains values of reflectance from Earth's surface
- 30 meter pixels, 15 meter panchromatic band
- Entire image of the Earth every 16 days

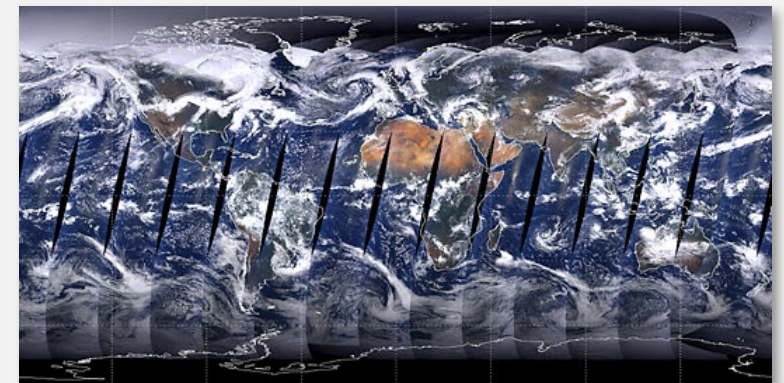
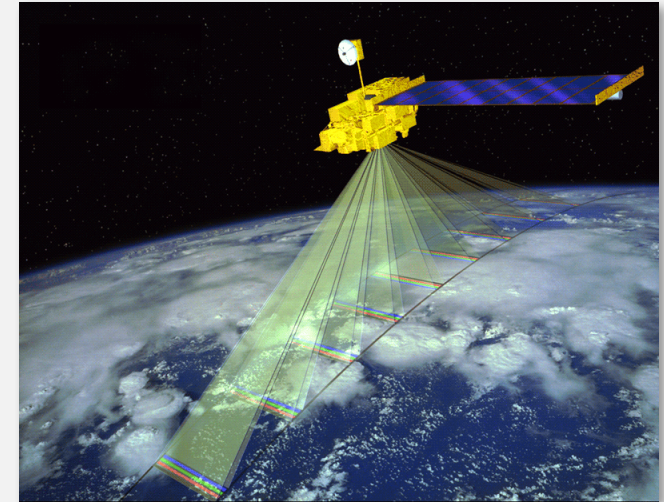


# Landsat Bands for NDVI

Wavelengths	Landsat 8 Bands	Landsat 4,5, 7 Bands
Coastal aerosol	Band 1	
Blue	Band 2	Band 1
Green	Band 3	Band 2
Red	Band 4	Band 3
Near Infrared (NIR)	Band 5	Band 4
Shortwave Infrared (SWIR) 1	Band 6	Band 5
Shortwave Infrared (SWIR) 2	Band 7	Band 7
Panchromatic	Band 8	Band 8 (L7)
Cirrus	Band 9	
Thermal Infrared 1	Band 10	Band 6
Thermal Infrared 2	Band 11	

# MODIS Overview

- Spatial Resolution
  - 250 m, 500 m, 1 km
- Temporal Resolution
  - Daily, 8 day, 16 day, monthly, quarterly, yearly
  - 2000 – present
- Data Format
  - Hierarchical data format – Earth Observing System Format (HDF–EO8)
- Spectral Coverage
- 36 bands (major bands include red, blue, IR, NIR, MIR)
  - Bands 1-2: 250 m
  - Bands 3-7: 500 m
  - Bands 8-36: 1000 m



# MODIS Land Products

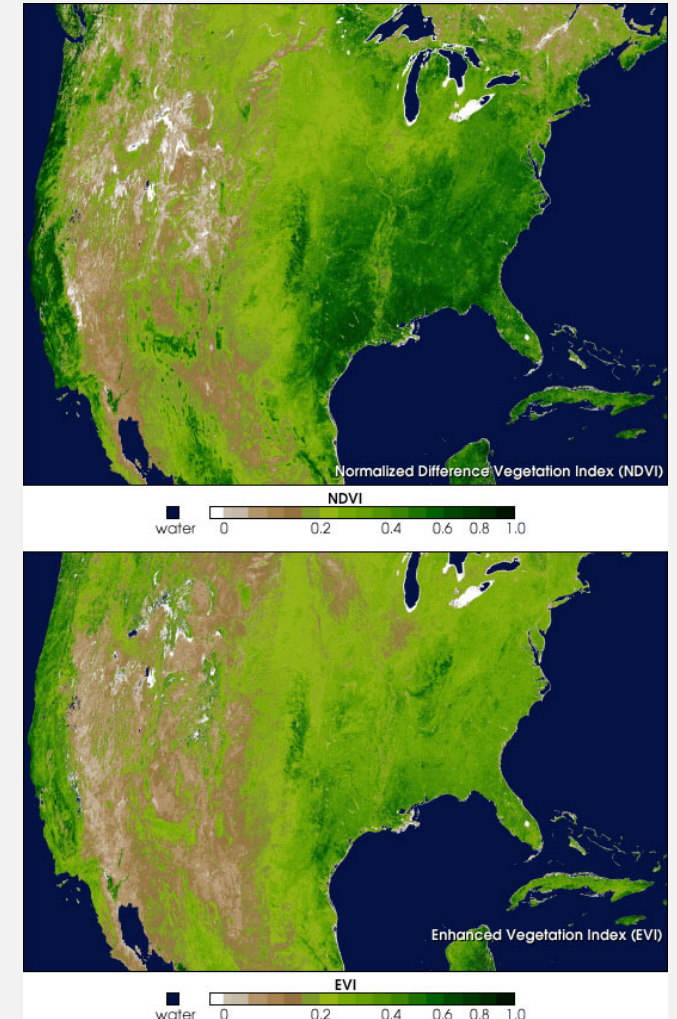
MODIS Name	Product Name	Spatial Resolution (m)	Temporal
MOD 09	Surface Reflectance	500	8-day
	Land Surface Temperature	1000	Daily, 8-day
MOD 12	Land Cover/Change	500	8-day, Yearly
MOD 13	Vegetation Indices	250-1000	16 day, monthly
MOD 14	Thermal Anomalies/Fire	1000	Daily, 8-day
MOD 15	Leaf Area Index/Fraction of Absorbed Photosynthetically Active Radiation (FPAR)	1000	4-day, 8-day
MOD 16	Evapotranspiration		
MOD 17	Primary Production	1000	8-day, yearly
MOD 43	Bidirectional reflectance distribution function (BRDF)/Albedo	500-1000	16-day
MOD 44	Vegetation Continuous Fields	250	yearly
MOD 45	Burned Area	500	monthly

Short name



# MODIS Vegetation Indices Product Overview

- Vegetation Indices:
  - NDVI (Normalized Difference Vegetation Index)
    - 16 day, 250 meter spatial resolution as a gridded level 3 product
    - Used for characterizing land surface processes
    - Anomalies can be used to identify drought
  - EVI (Enhanced Vegetation Index)
    - Minimizes canopy background
    - Improvement in dense vegetation conditions



A topographic map of the United States, showing elevation with brown and green colors. A semi-transparent gray rectangular box is overlaid on the central part of the map, covering the mountainous regions. The title "Drought Monitoring with Precipitation" is centered within this box.

# Drought Monitoring with Precipitation

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# Precipitation Anomalies as Drought Indicator

- Anomalies are a departure from the long-term climatological mean values and indicate dry or wet conditions compared to the climatological condition
- The figure shows accumulated precipitation anomalies (percent deficit in precipitation) map for the California between 2012 and 2014, based on TRMM data

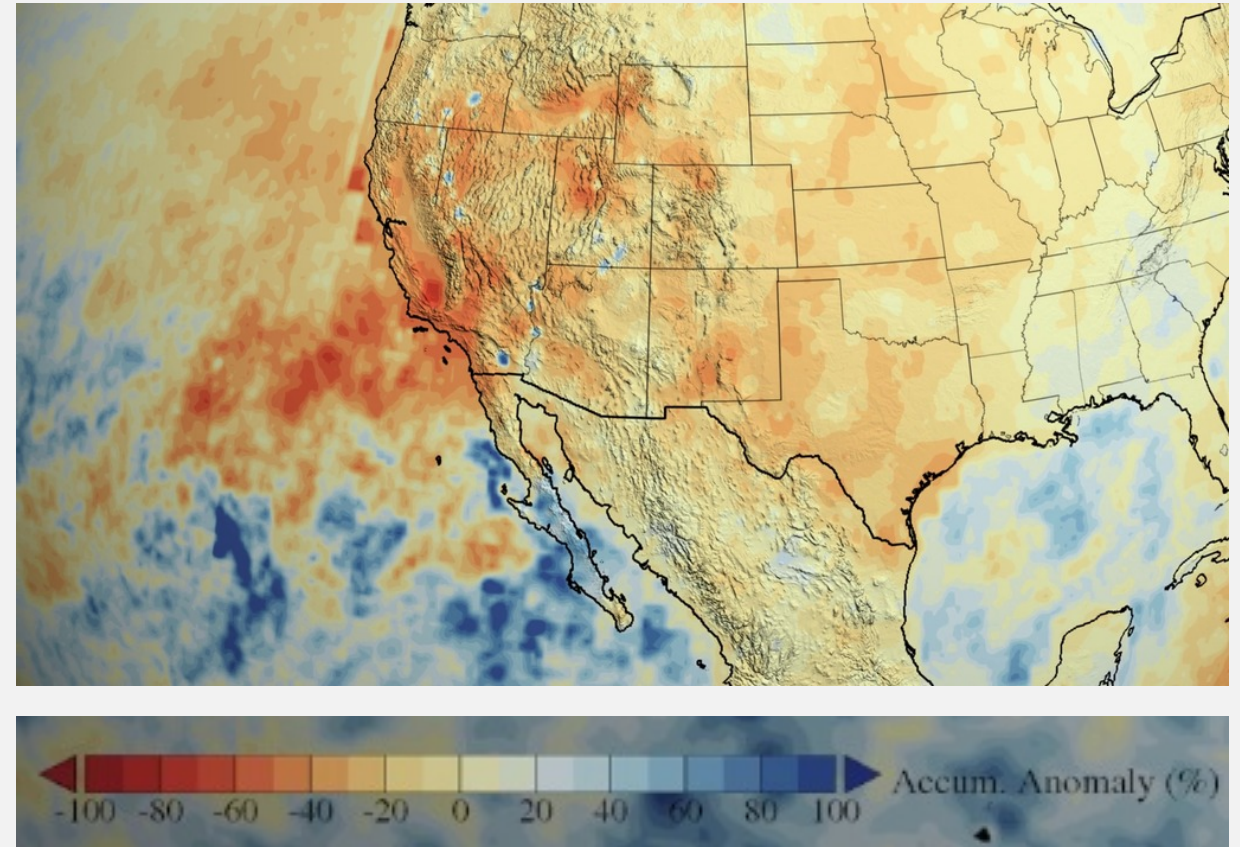
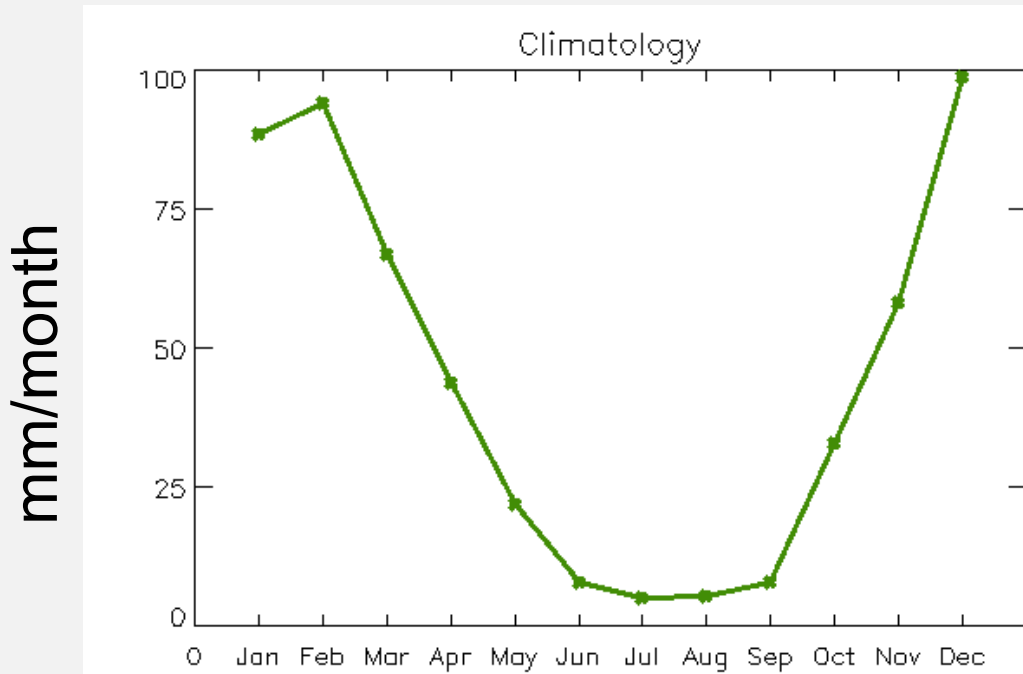


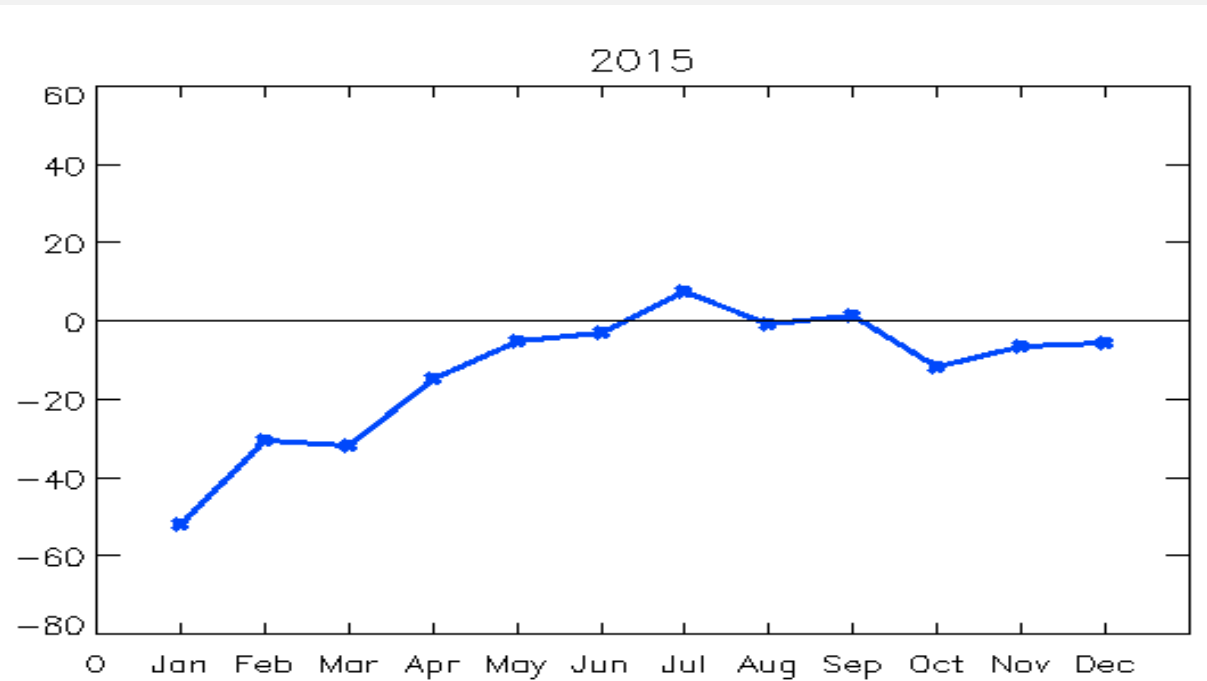
Image Credit: NASA Goddard Scientific Visualization Studio

# TMPA Climatology and Anomalies Over California

## Averaged over 1998-2016



## Rainfall Deficit over California in 2015





# Precipitation-Based Drought Indices

- Drought indices are mathematical representation of water deficit (and excess) compared to historical data
  - Help decide when to start implementing water conservation or drought response measures
  - Can be used to analyze drought frequency, severity, and duration for a given location and period
- Commonly used operational drought indices are:
    - Standardized Precipitation Index (SPI)
    - Palmer Drought Severity Index (PDSI)



Source: [National Drought Mitigation Center](#); Image: [Handbook of Drought Indicators & Indices](#)

# Standardized Precipitation Index (SPI)

<http://www.cpc.ncep.noaa.gov/products/Drought/Monitoring/spi.shtml>

- Primarily defined to characterize meteorological drought
- Mathematically, historical rainfall data at any location fitted with gamma distribution represent cumulative probability function
- If a rainfall event is a low probability on the cumulative probability function, it is indicative of a drought event
- The SPI values can be interpreted as the number of standard deviations by which the observed rainfall anomaly deviates from the long-term mean

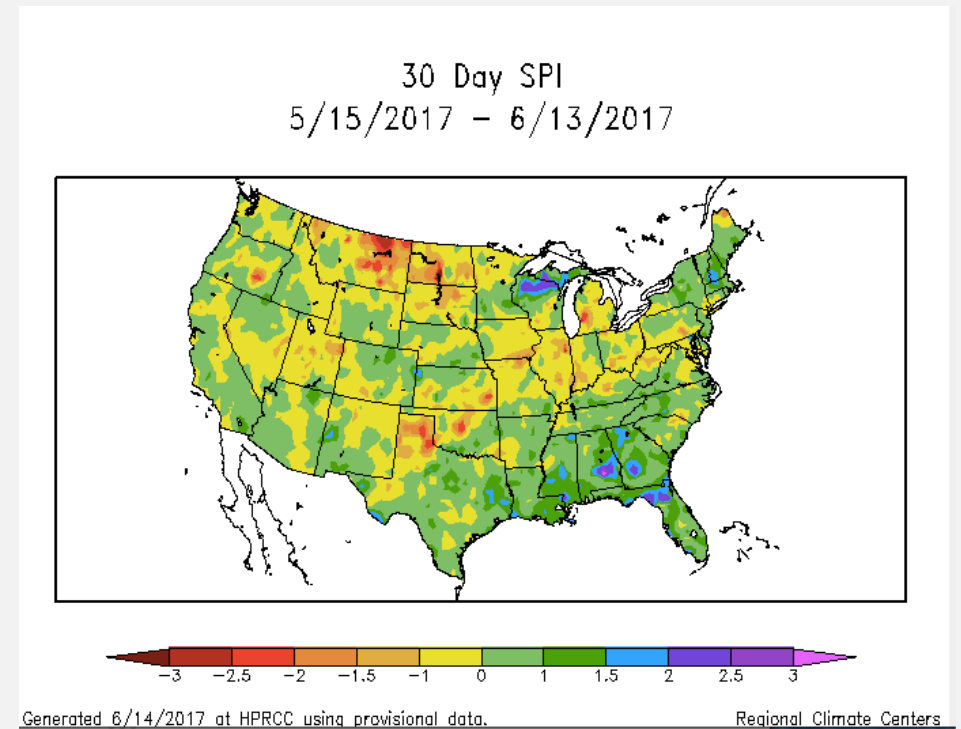


Image Credit: HPRCC ACIS Climate Map  
<http://hprcc.unl.edu/maps.php?map=ACISClimateMaps#>

Text Source: [NCAR/UCAR Climate Data Guide](#); Guttman, N. B., 1999: Accepting the Standardized Precipitation Index: A calculation algorithm. J. Amer. Water Resour. Assoc., 35(2), 311-322.

# Standardized Precipitation Index (SPI)

<http://drought.unl.edu/MonitoringTools/ClimateDivisionSPI/Interpretation.aspx>

SPI averaged over different time period indicate severity and duration of drought

- 3-month SPI: reflects short- to medium-term moisture conditions
- 6-month SPI: reflects medium-term precipitation conditions, including seasonal precipitation patterns
- 9-month SPI: reflects medium-term drought that potentially affects agriculture
- 12-month and longer SPI: represents drought that potentially affects streamflow, reservoir levels

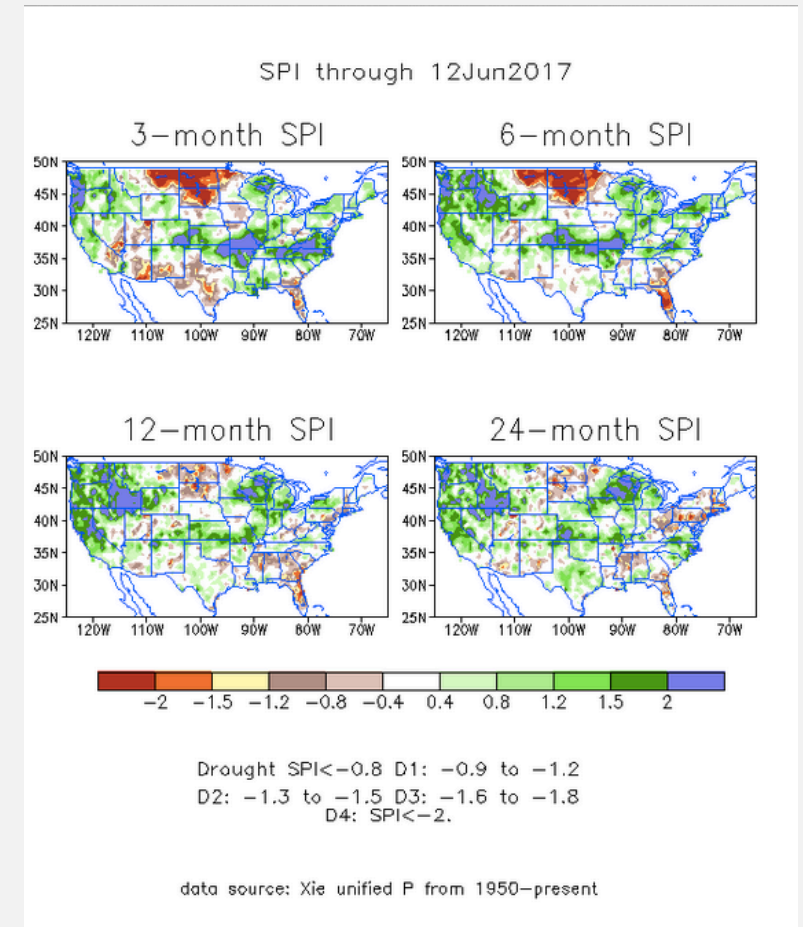


Image Credit: CPC/NOAA

# SPI: Strengths and Limitations

<http://climatedataguide.ucar.edu/climate-data/standardized-precipitation-index-spi>

## Strengths

- Easy to calculate based on precipitation
- Different time scales indicate duration of drought and impacts on hydrology and agricultural
- Program to calculate SPI is available from National Drought Mitigation Center
  - <http://drought.unl.edu/MonitoringTools/DownloadableSPIProgram.aspx>
  - (requires learning)

## Limitations

- Based on precipitation (water supply) alone and does not take into account temperature or evapotranspiration (water depletion)
- Values depends on the climatological precipitation used
- Precipitation intensity of rain or how it affects runoff, streamflow, and water availability for a given region

# Palmer Drought Severity Index (PDSI)

<http://climatedataguide.ucar.edu/climate-data/palmer-drought-severity-index-pdsi>

- An index for evaluating the severity and frequency of prolonged periods of abnormally dry or wet conditions
- Uses **temperature** and **precipitation** data and a physical water balance model to estimate relative dryness
- A standardized index that goes from -10 (dry) to +10 (wet)

$$PDSI(m) = PDSI\{m-1 + [Z(m)/3 - 0.103 PDSI(m-1)]\}$$

- m = month index
- Z(m) = moisture anomaly index (based on a water balance model)
- Learn more:
  - [http://www.cpc.ncep.noaa.gov/products/analysis\\_monitoring/cdus/palmer\\_drought/wpdanote.shtml](http://www.cpc.ncep.noaa.gov/products/analysis_monitoring/cdus/palmer_drought/wpdanote.shtml)

Palmer, W. C., 1965: Meteorological drought. Research Paper 45, U.S. Dept. of Commerce, 58 pp.

Dai, A., K. E. Trenberth, and T. Qian, 2004: A global data set of Palmer Drought Severity Index for 1870-2002: Relationship with soil moisture and effects of surface warming. J. Hydrometeorology, 5, 1117-1130.

# PDSI: Strengths and Limitations

<http://climatedataguide.ucar.edu/climate-data/palmer-drought-severity-index-pdsi>

## Strengths

- More effective for long-term drought
- Takes account of surface air temperature and potential evapotranspiration, not just precipitation
- Takes prior month's condition into account

## Limitations

- Lacks multi-time scale features
- Not comparable across regions, but self-calibrating PDSI can alleviate this issue
- Assumes that precipitation is immediately available (delayed runoff due to snow or ice not considered)

# SPI and PDSI from NOAA

<http://www.ncdc.noaa.gov/temp-and-precip/drought/nadm/indices>

- SPI and PDSI based on surface data are available from North American Drought Monitor
- Though remote sensing-based precipitation record is relatively short, TRMM-TMPA has shown to be useful for getting regional SPI (De Jesus et al., 2016) and global PDSI (Sheffield et al, 2012)

North American Drought Monitor

Overview | NADM Maps | Indices and Data | Geographical Reference Maps | Climatology Maps

### Drought Indices and Data

Use the form below to access the latest available month's drought indicators and data.

Indicator:  Data:

Standard Precipitation Index  
 Percent of Average Precipitation  
 Palmer Drought Index

1-Month Standardized Precipitation Index  
May 2017

• -2.00 or less  
• -1.50 to -1.00 dry  
• -1.00 to -0.50  
• -0.50 to -0.00  
• -0.50 to -0.01 near normal  
• -0.51 to +0.79  
• +0.80 to +1.29  
• +1.30 to +1.59  
• +1.60 to +1.99  
• +2.00 or greater

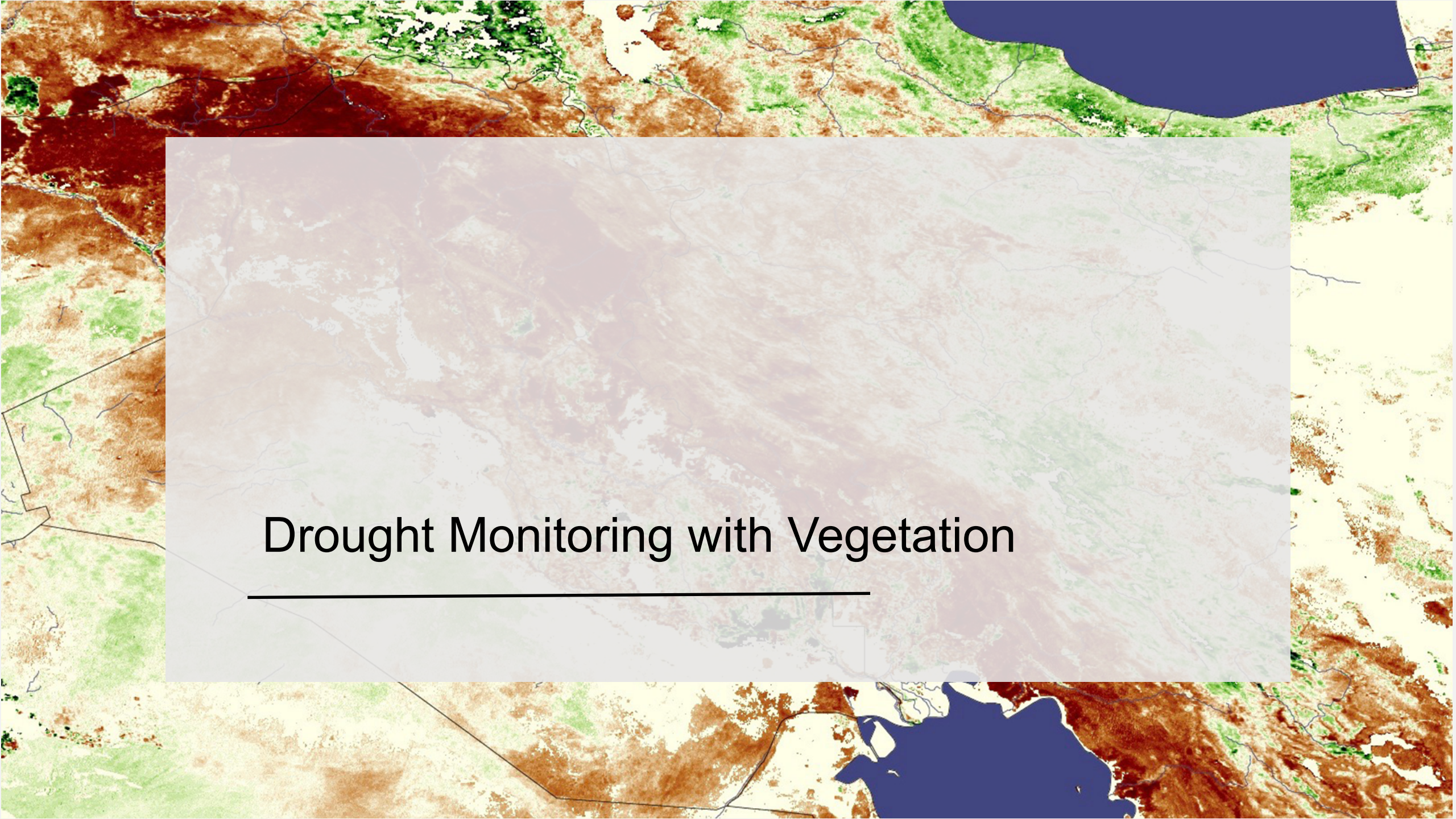
Documentation  
[readme.txt](#)

Data

- [01mon-spi-ak.txt](#)
- [01mon-spi-cn.txt](#)
- [01mon-spi-mx.txt](#)
- [01mon-spi-us.txt](#)
- [02mon-spi-ak.txt](#)

De Jesús, A., J. Agustín Breña-Naranjo, A. Pedrozo-Acuña, and V. Hugo Alcocer Yamanaka, 2016: The Use of TRMM 3B42 Product for Drought Monitoring in Mexico, *Water*, 8, doi:10.3390/w8080325

Sheffield, J., G. Goteti, and E. F. Wood, 2006: Development of a 50-yr high-resolution global dataset of meteorological forcings for land surface modeling, *J. Climate*, 19 (13), 3088-3111

A satellite-style map of a region, likely the western United States, showing terrain, vegetation, and water bodies. A semi-transparent light gray rectangular box is overlaid on the map, containing the title text. The map uses a color palette where greens indicate vegetation, browns and tans indicate bare soil or low vegetation, and blues indicate water bodies. A network of thin blue lines represents rivers and streams. The title text is centered within the gray box.

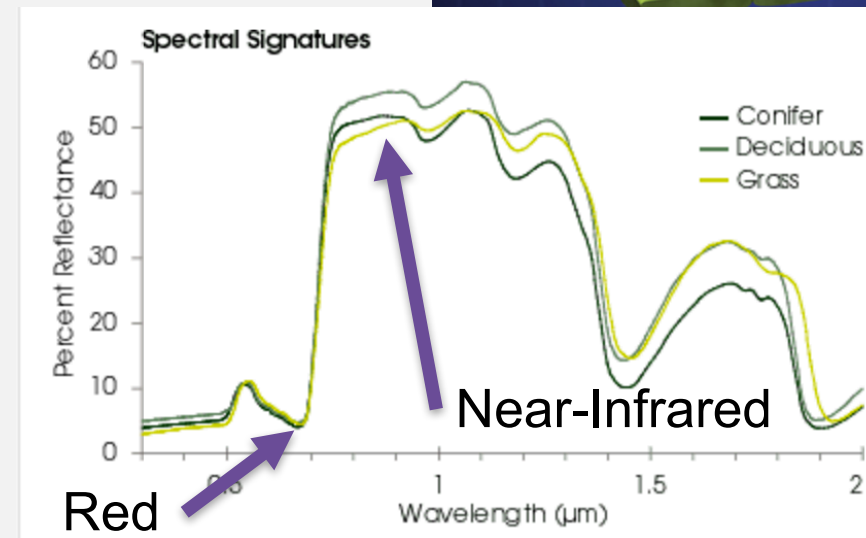
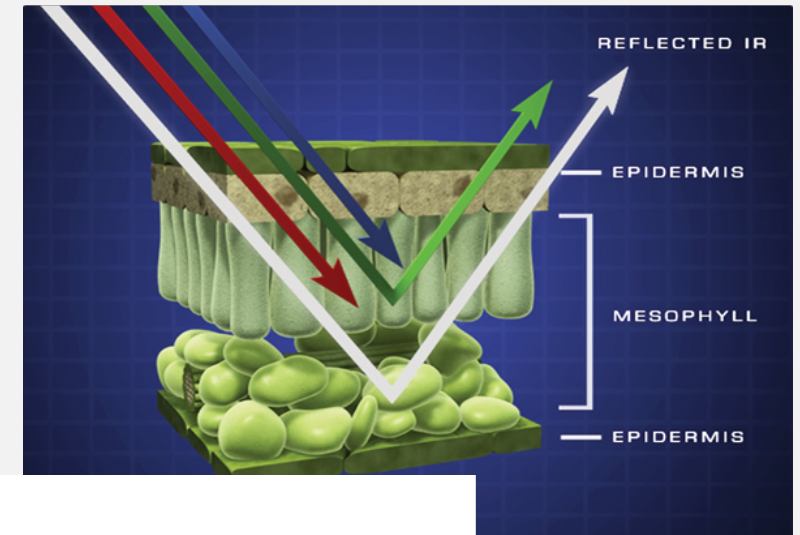
# Drought Monitoring with Vegetation

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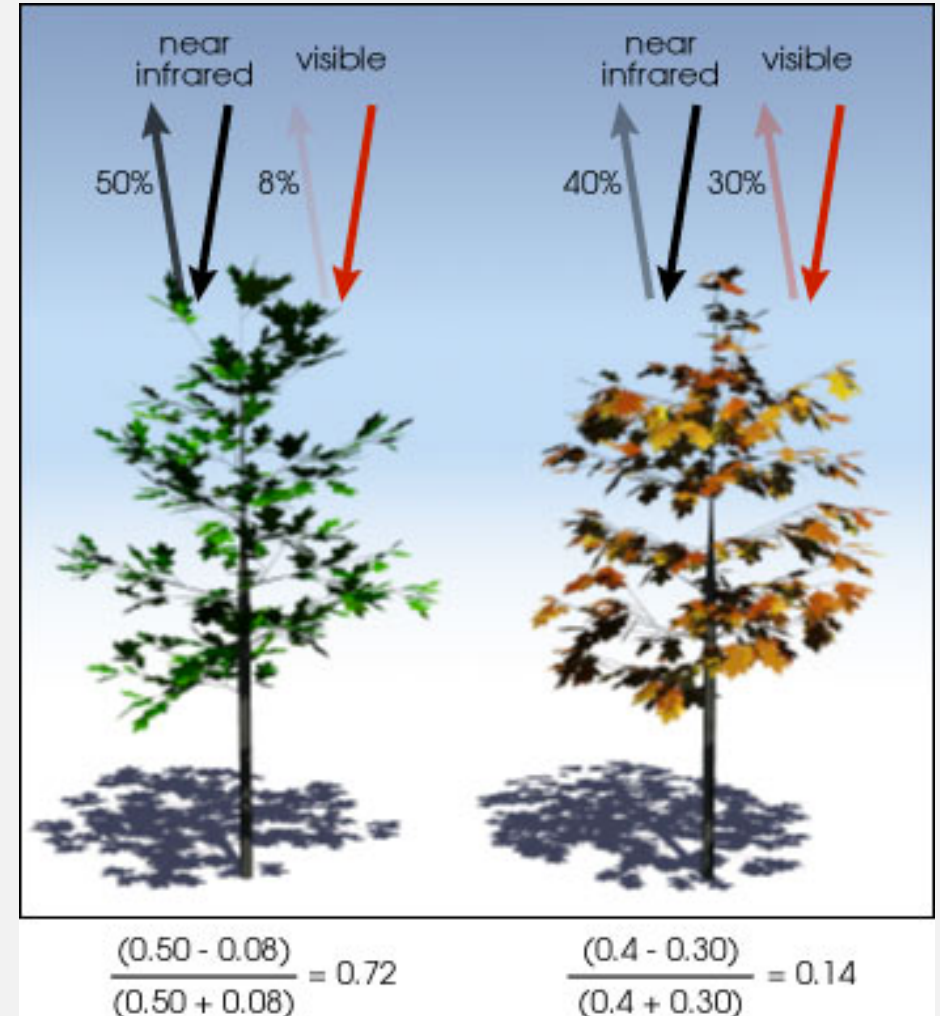
# What is NDVI?

- Normalized Difference Vegetation Index
  - Based on the relationship between red and near-infrared wavelengths
  - Chlorophyll strongly absorbs visible (red)
  - Plant structure strongly reflects near-infrared



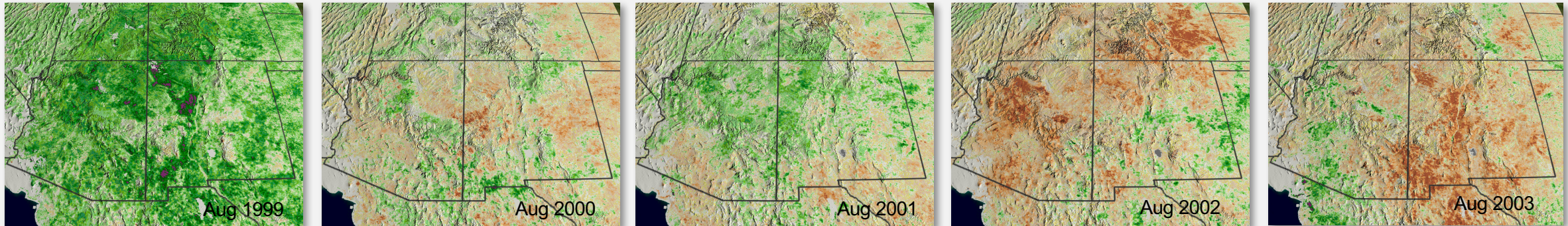
# What is NDVI?

- NDVI formula: 
$$\frac{\text{Near Infrared} - \text{Red}}{\text{Near Infrared} + \text{Red}}$$
- Values range from -1.0 to 1.0
  - Negative values to 0 mean no green leaves
  - Values close to 1 indicate the highest possible density of green leaves



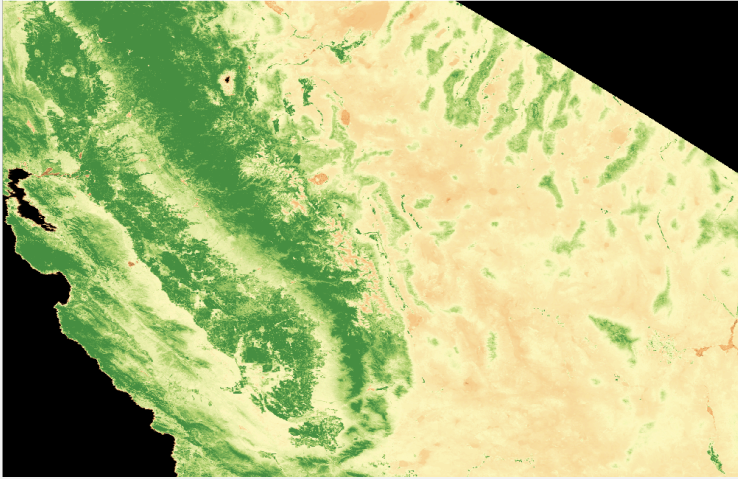
# NDVI Anomalies

- Departure of NDVI from the long-term average, normalized by long-term variability
- Generated by subtracting the long-term mean from the current value for that month of the year for each grid cell.
- Indicates if vegetation greenness at a particular location is typical for that period or if the vegetation is more or less green



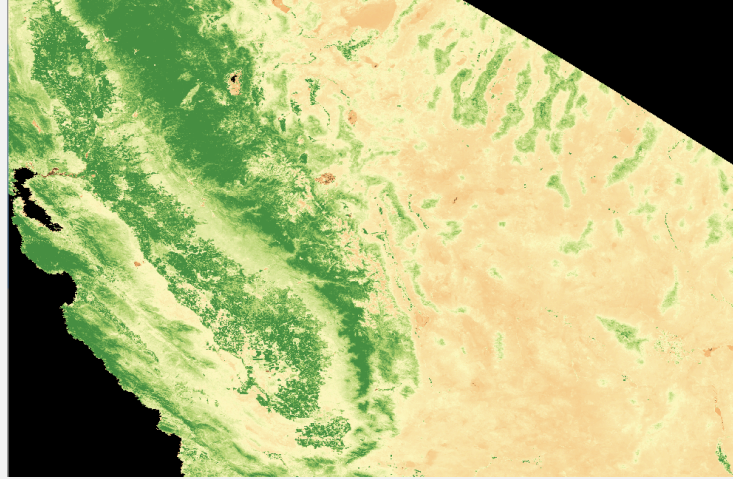
NDVI Anomalies in the southwestern United States. Image Credit: NASA/Goddard Space Flight Center Scientific Visualization Studio.

# NDVI Anomalies: Calculation Example



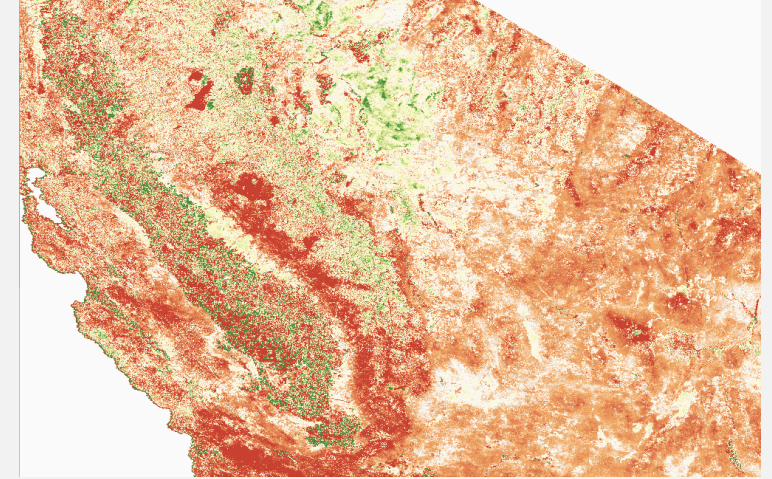
## Long-Term Average

Calculate average July  
NDVI for 2001-2010



## NDVI for Month of Interest

Obtain July 2015 NDVI



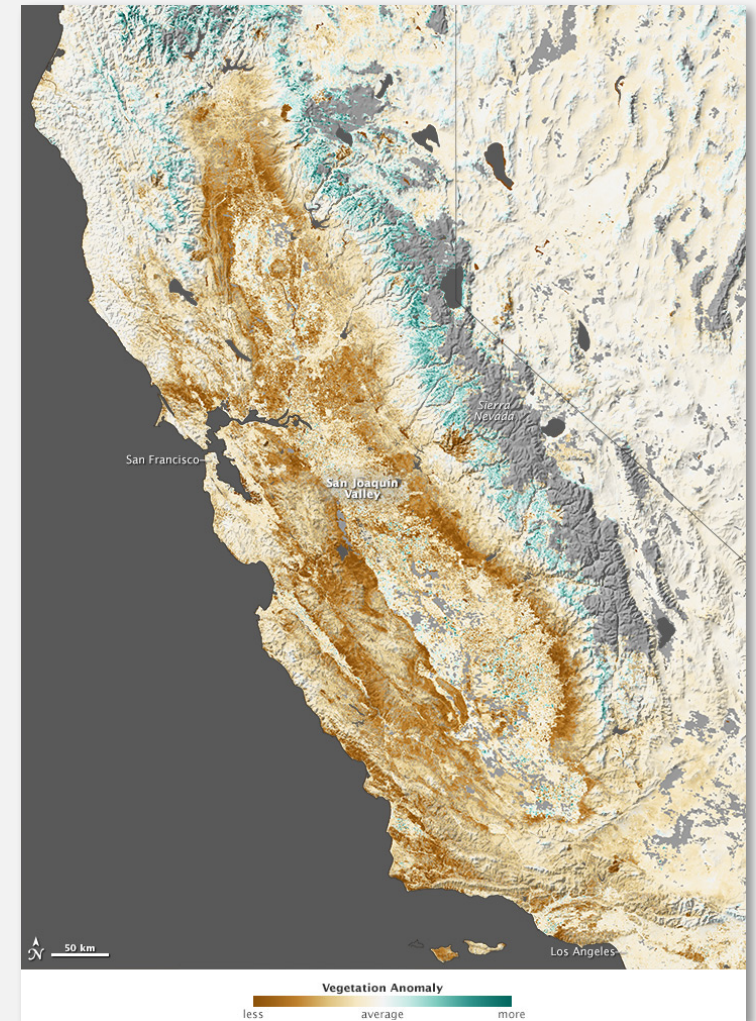
## Calculate Anomalies

Subtract average  
monthly NDVI  
(2001-2010) from  
July 2015 NDVI

# NDVI Anomaly Example: California Drought

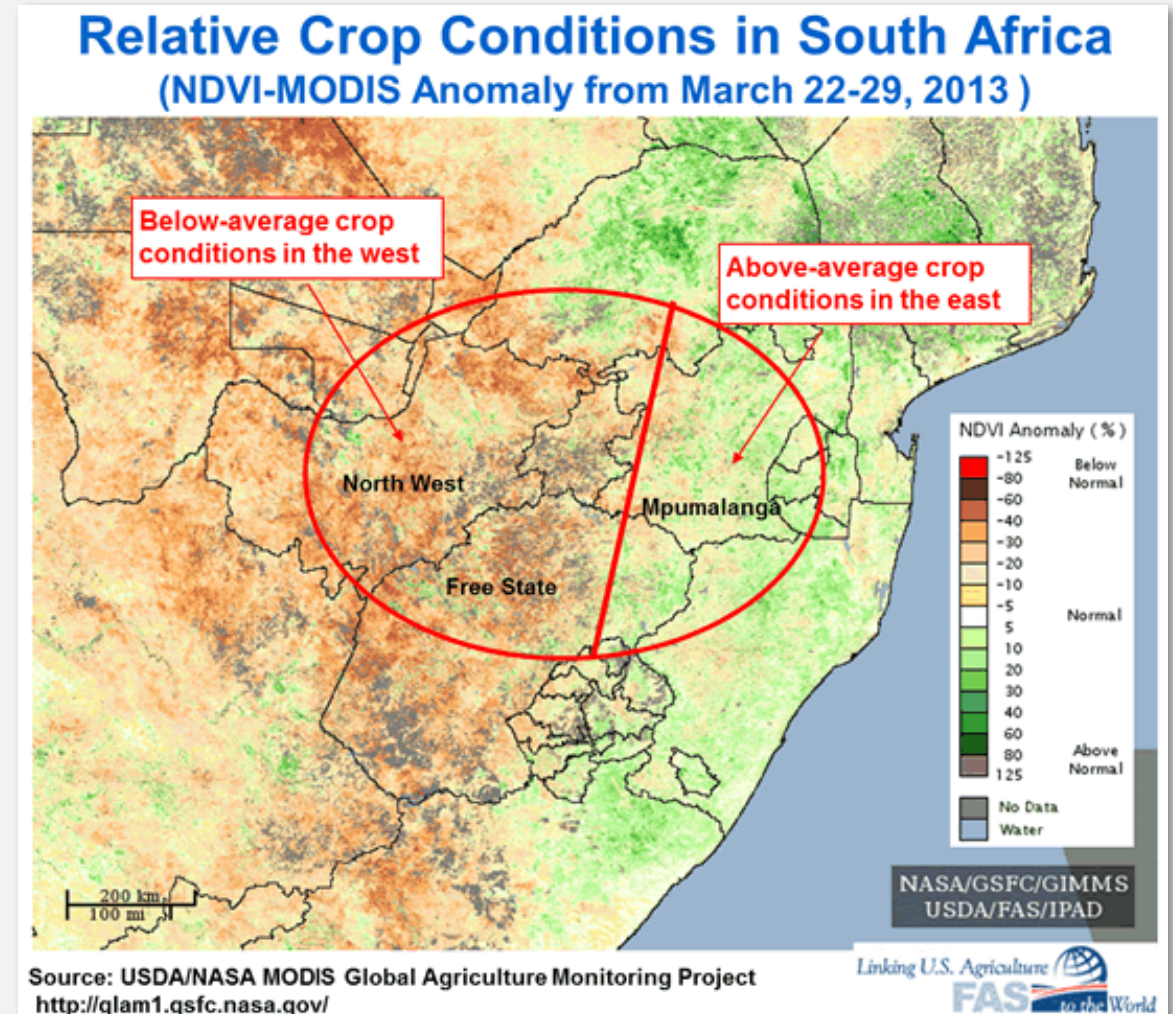
- Image shows the NDVI anomalies from January 17 to February 1, 2014, against average conditions over the same period from the past decade
- Notice the below-average vegetation along most of the Central Valley farmland
- Vegetation in the Sierra Nevada is greener than usual, this is mainly because of a lack of snow, which is also bad news for California

Image Credit: NASA Earth Observatory



# NDVI Anomaly Example: South Africa

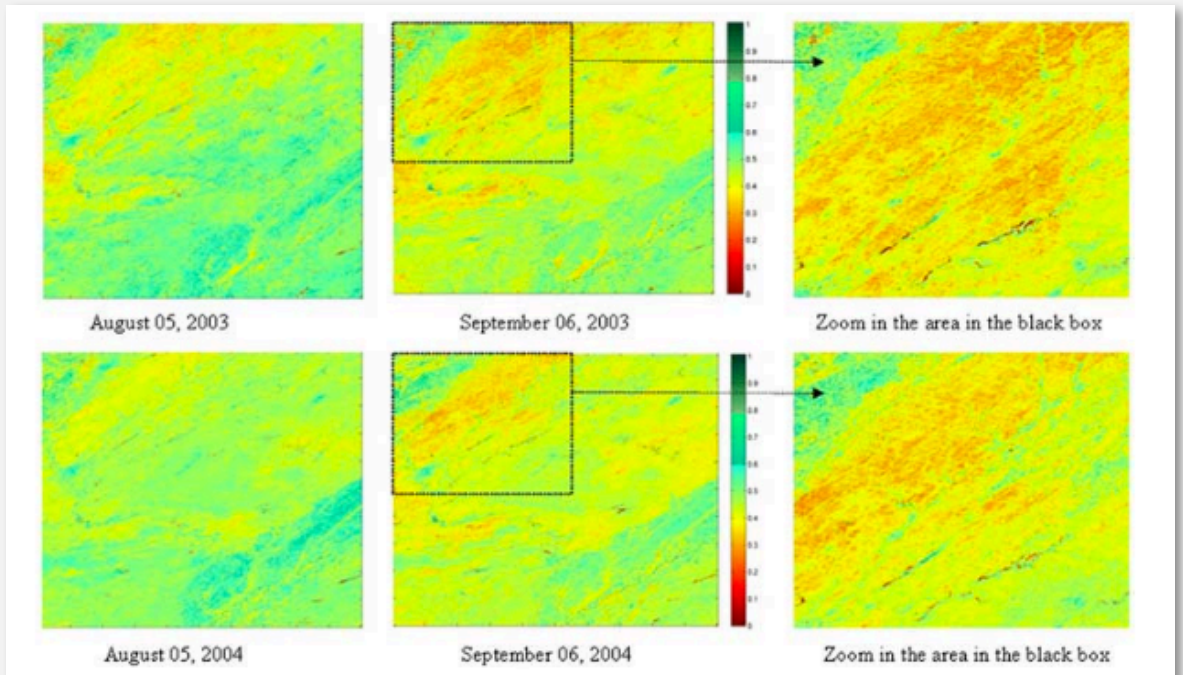
- South Africa's crop conditions at the end of March are summarized in the NDVI-MODIS anomaly
- Indicates below-average crop conditions in both the northwest and western Free State provinces and above-average crop conditions in Mpumalanga province



# Normalized Difference Moisture Index (NDMI)

- Measure of vegetation moisture
- Frequently used in drought monitoring
  - detects more subtle changes in vegetation moisture
- Used in wildfire hazard potential

$$NDMI = \frac{(NIR - SWIR)}{NIR + SWIR}$$

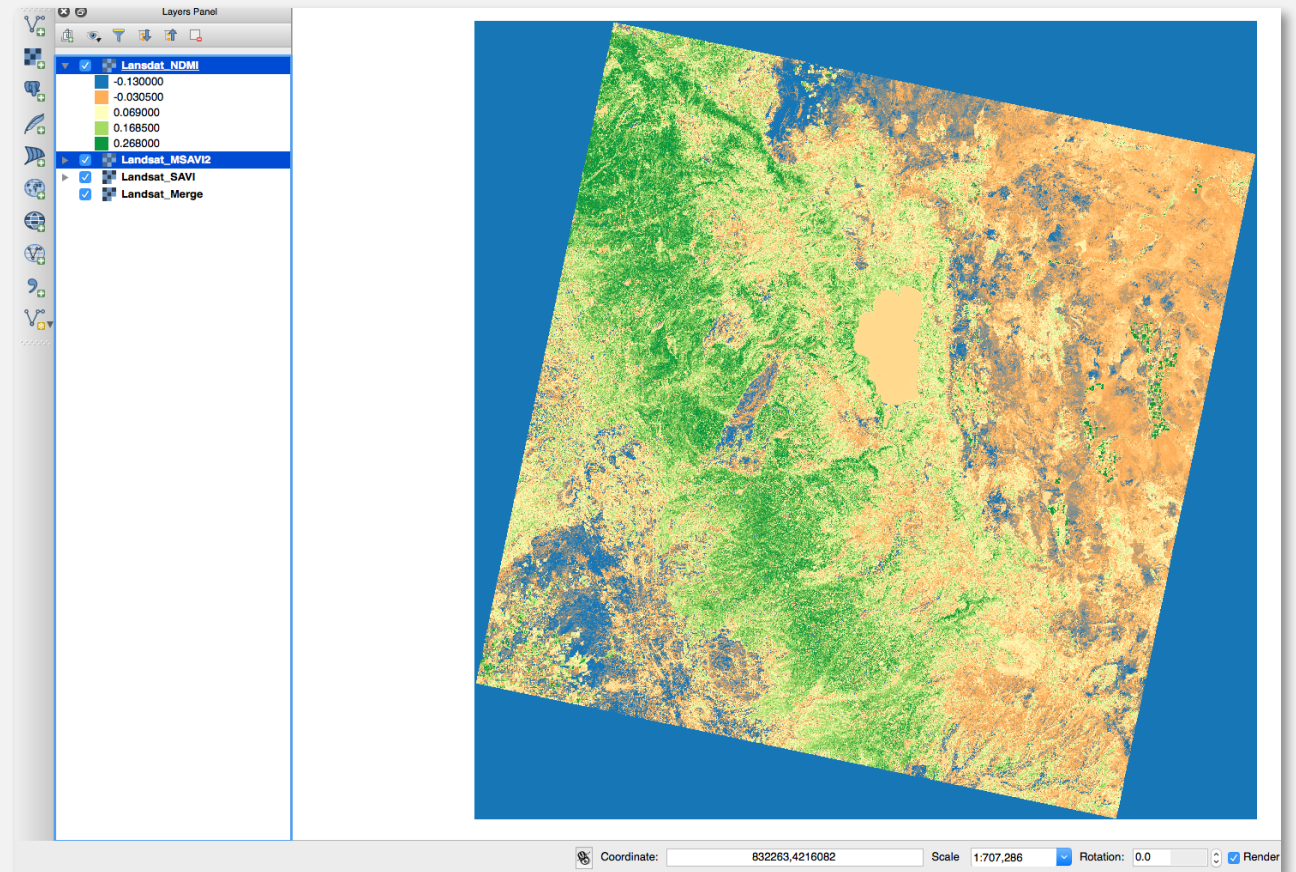


Example of NDMI. Image Credit: Wang and Qu, 2007

# Normalized Difference Moisture Index (NDMI)

- Remember: Landsat Bands
  - Landsat 4-7
    - NIR = Band 4
    - SWIR = Band 5
  - Landsat 8
    - NIR = Band 5
    - SWIR = Band 6

$$NDMI = \frac{(NIR - SWIR)}{NIR + SWIR}$$



Example of NDMI using the California Landsat scene from week 2 exercise



The background is a topographic map showing terrain elevation with brown and green colors. A semi-transparent white rectangular box is centered over the map, containing the title text. A horizontal black line is positioned below the text.

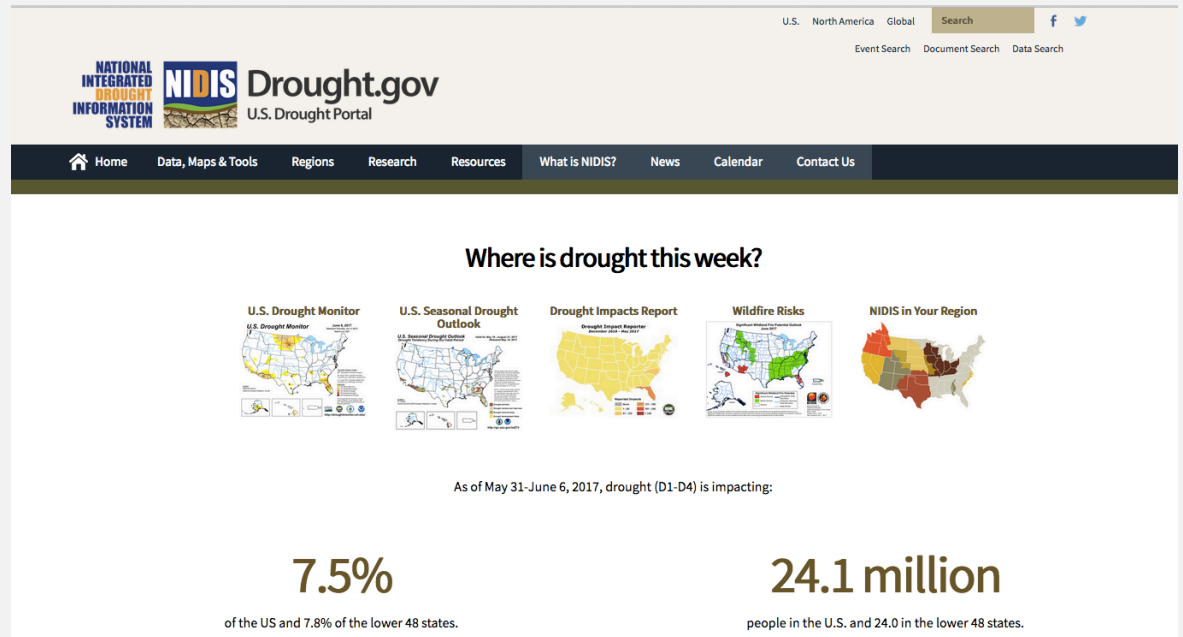
# Introduction and Demonstration of Web-Based Drought Monitoring Tools

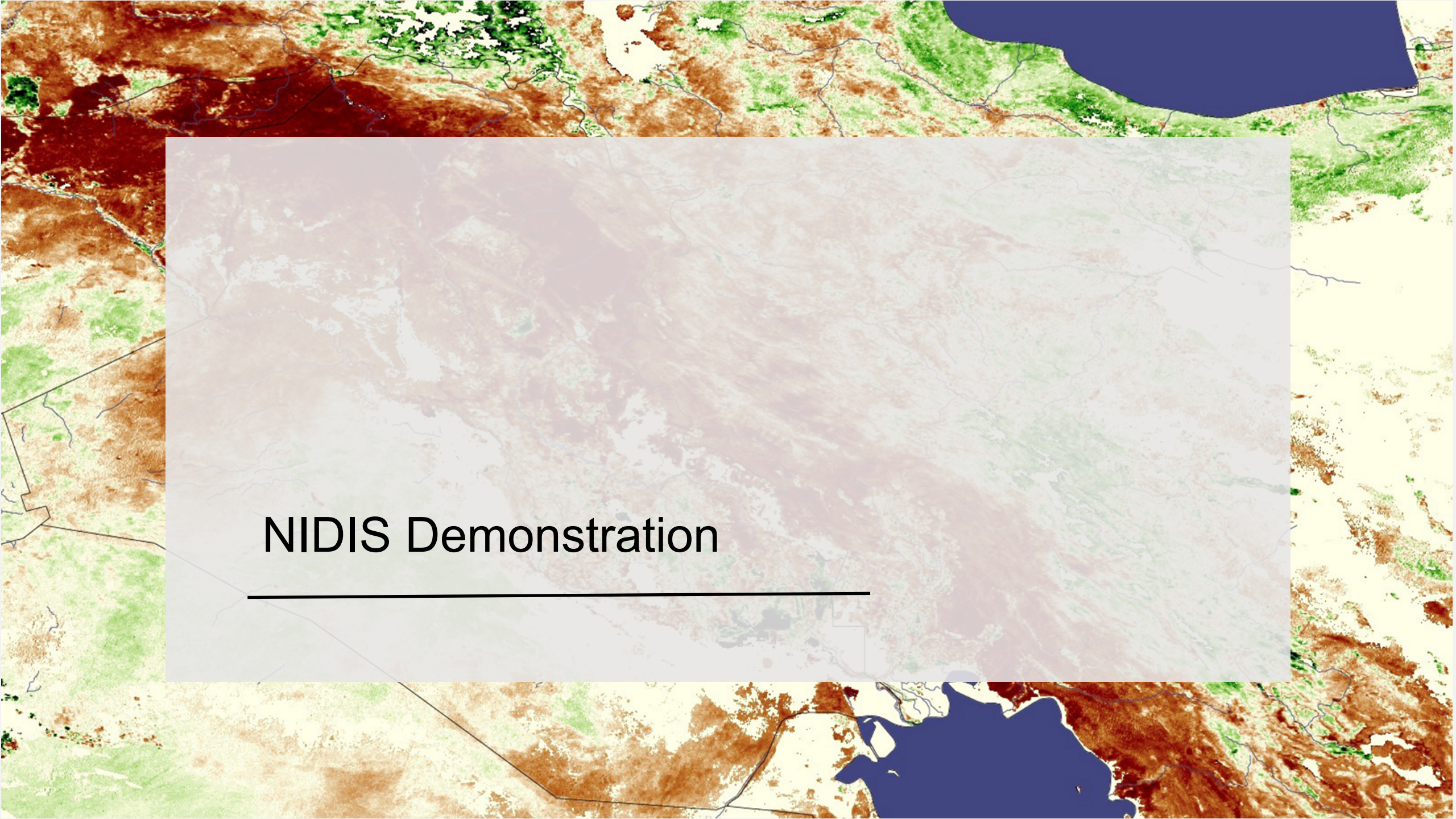
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# National Integrated Drought Information System (NIDIS)

<http://www.drought.gov/drought/>

- U.S. and global drought monitoring
- Provides
  - Surface-based precipitation, temperature, SPI, and PDSI
  - Satellite-based vegetation health index
- Interactive maps available



A topographic map of a region, likely in the western United States, showing terrain elevation with brown and green colors. A semi-transparent gray rectangular box is overlaid on the map, covering most of the central and right portions. The text "NIDIS Demonstration" is centered within this box, with a horizontal line below it.

# NIDIS Demonstration

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# U.S. Drought Monitor

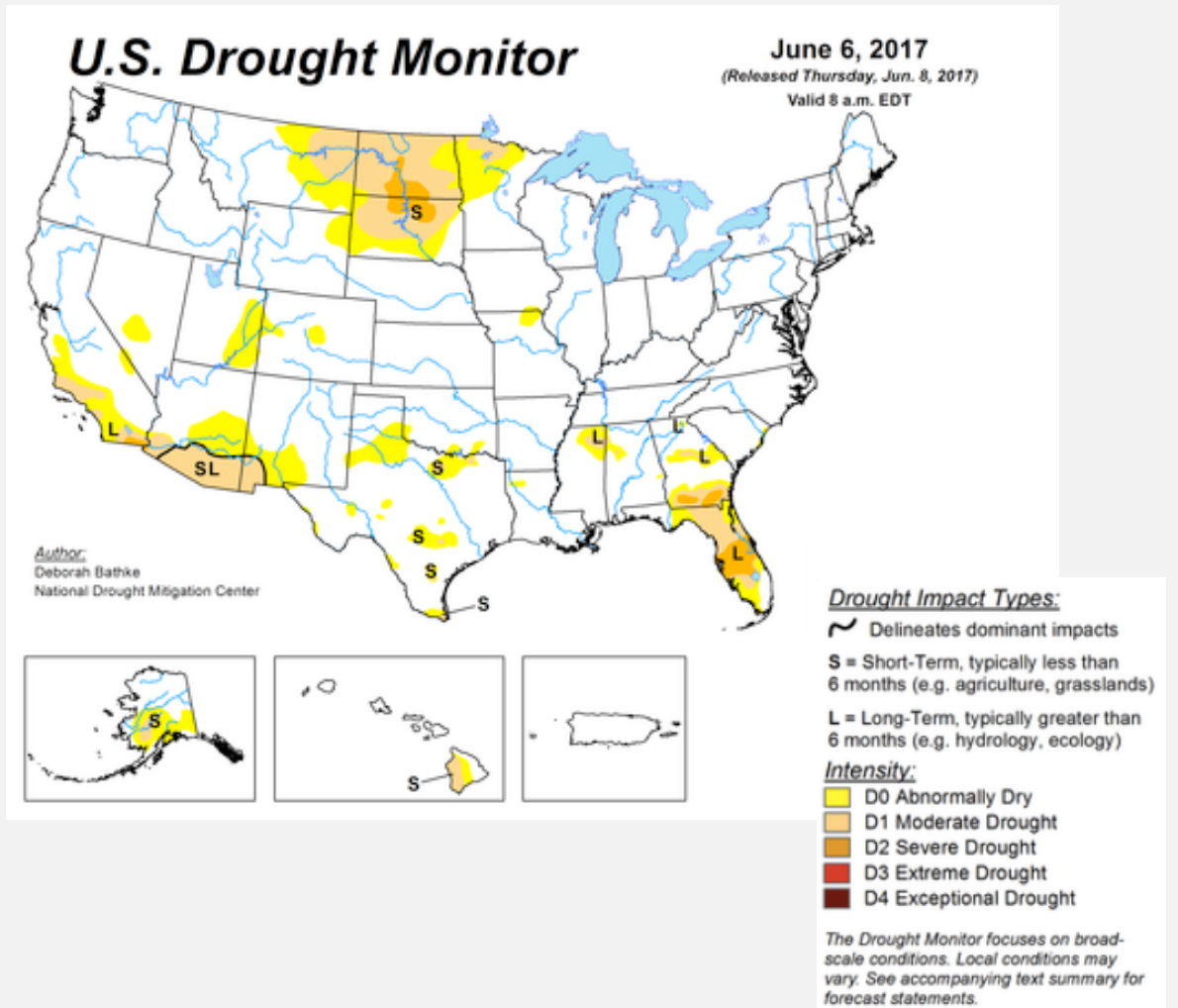
<http://www.drought.gov/drought/>

The weekly drought map shows drought severity, and impact types (Short, Long)

Category	Description	Possible Impacts	Ranges				
			Palmer Drought Severity Index (PDSI)	CPC Soil Moisture Model (Percentiles)	USGS Weekly Streamflow (Percentiles)	Standardized Precipitation Index (SPI)	Objective Drought Indicator Blends (Percentiles)
D0	Abnormally Dry	<ul style="list-style-type: none"> <li>Going into drought:                             <ul style="list-style-type: none"> <li>short-term dryness slowing planting, growth of crops or pastures</li> </ul> </li> <li>Coming out of drought:                             <ul style="list-style-type: none"> <li>some lingering water deficits</li> <li>pastures or crops not fully recovered</li> </ul> </li> </ul>	-1.0 to -1.9	21 to 30	21 to 30	-0.5 to -0.7	21 to 30
D1	Moderate Drought	<ul style="list-style-type: none"> <li>Some damage to crops, pastures</li> <li>Streams, reservoirs, or wells low, some water shortages developing or imminent</li> <li>Voluntary water-use restrictions requested</li> </ul>	-2.0 to -2.9	11 to 20	11 to 20	-0.8 to -1.2	11 to 20
D2	Severe Drought	<ul style="list-style-type: none"> <li>Crop or pasture losses likely</li> <li>Water shortages common</li> <li>Water restrictions imposed</li> </ul>	-3.0 to -3.9	6 to 10	6 to 10	-1.3 to -1.5	6 to 10
D3	Extreme Drought	<ul style="list-style-type: none"> <li>Major crop/pasture losses</li> <li>Widespread water shortages or restrictions</li> </ul>	-4.0 to -4.9	3 to 5	3 to 5	-1.6 to -1.9	3 to 5
D4	Exceptional Drought	<ul style="list-style-type: none"> <li>Exceptional and widespread crop/pasture losses</li> <li>Shortages of water in reservoirs, streams, and wells creating water emergencies</li> </ul>	-5.0 or less	0 to 2	0 to 2	-2.0 or less	0 to 2

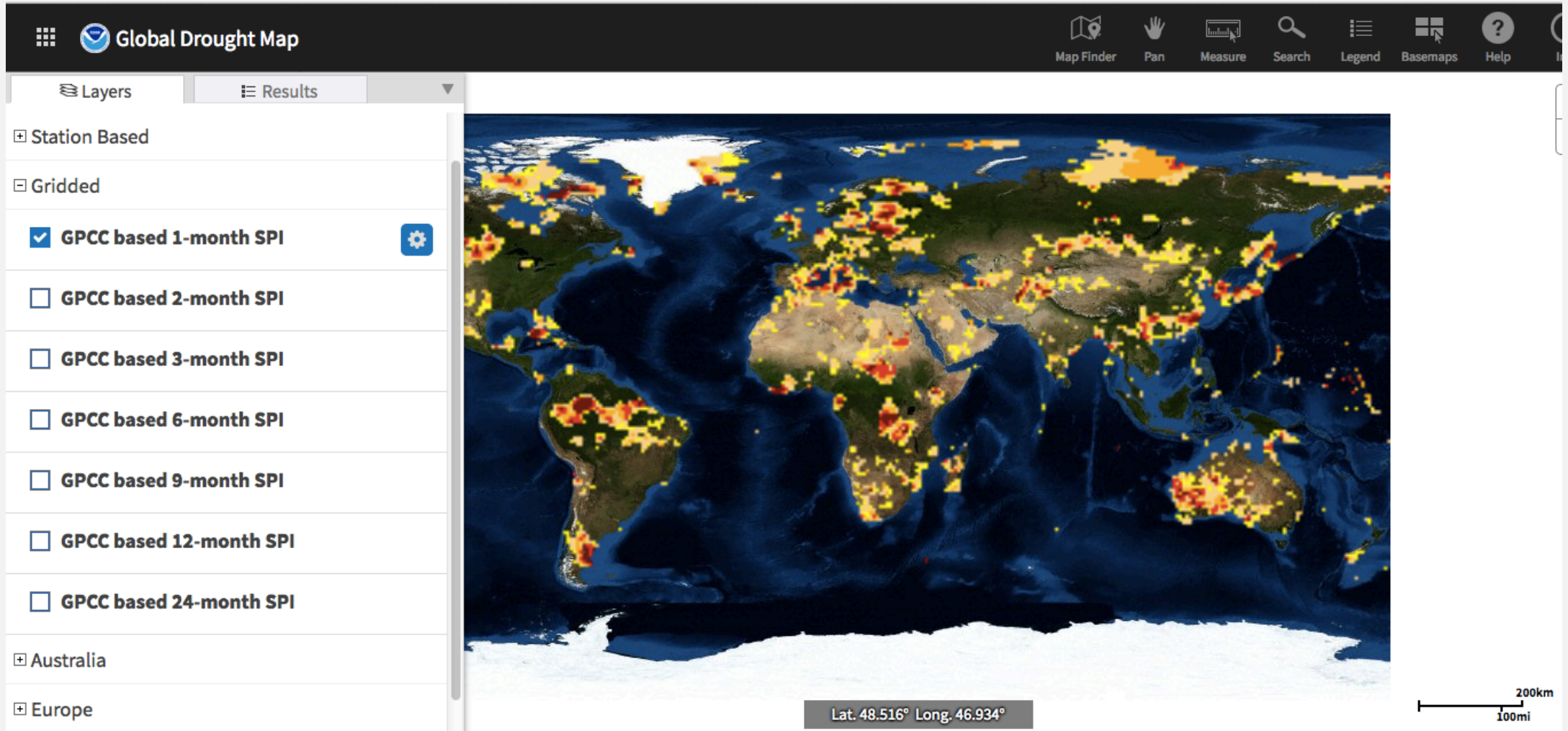
Short-term drought indicator blends focus on 1-3 month precipitation. Long-term blends focus on 6-60 months. Additional indices used, mainly during the growing season, include the USDA/NASS Topsoil Moisture, Keetch-Byram Drought Index (KBDI), and NOAA/NESDIS satellite Vegetation Health Indices. Indices used primarily during the snow season and in the West include snow water content, river basin precipitation, and the Surface Water Supply Index (SWSI). Other indicators include groundwater levels, reservoir storage, and pasture/range conditions.

Credit: <http://droughtmonitor.unl.edu/AboutUs/ClassificationScheme.aspx>



# Global Drought Monitor

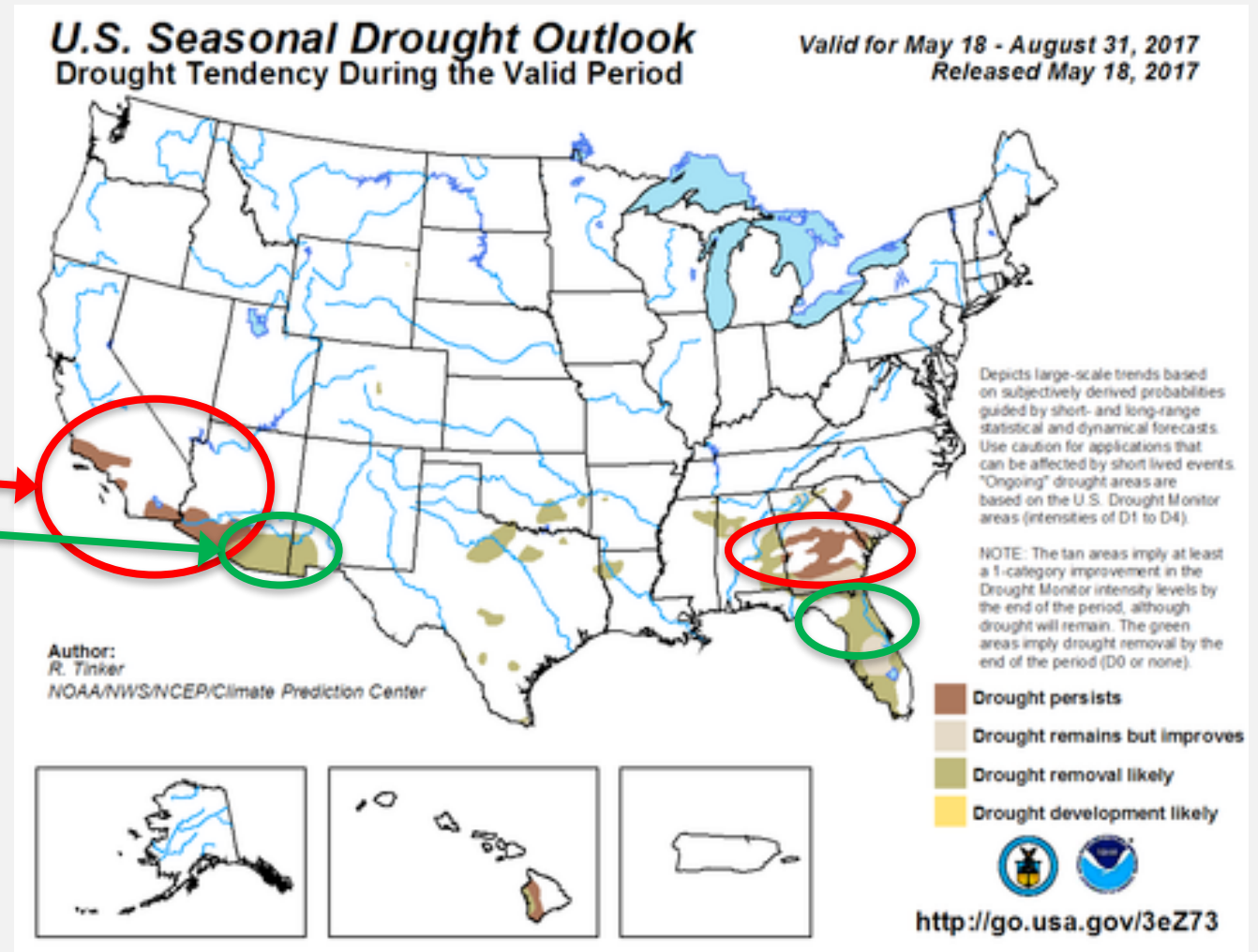
<http://gis.ncdc.noaa.gov/maps/ncei/drought/global/>



# U.S. Seasonal Drought Outlook

<http://www.drought.gov/drought/>

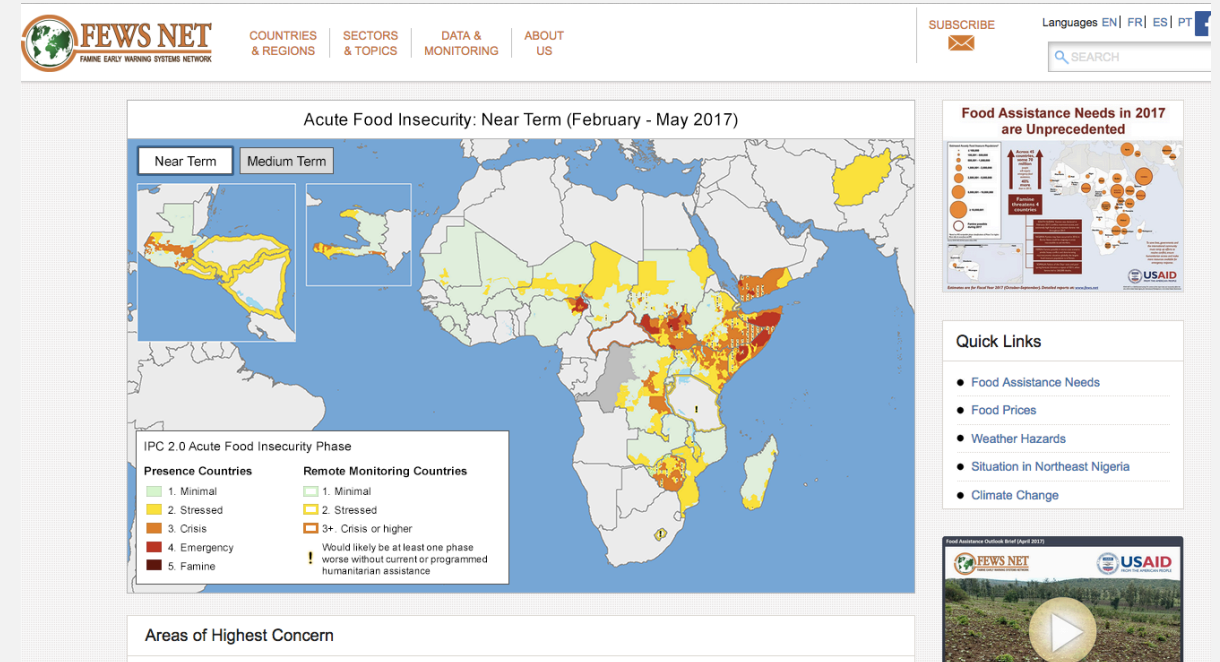
June to September 2017 outlook based on NOAA Climate Prediction Center, with persistent droughts and likely drought recovery in certain areas



# Famine Early Warning System Network (FEWS NET)

<http://www.fews.net/>

- Created by USAID in 1985
- A joint project among NASA, NOAA, USDA, and USGS
- Uses MODIS NDVI and TRMM in preparing rainfall climatology
- Provides evidence-based famine analysis to help government decision-makers and relief agencies plan for and respond to humanitarian crises



The background is a topographic map showing terrain with brown and green colors, and a blue body of water in the upper right. A semi-transparent grey rectangular box is centered on the map, containing the text 'FEWS NET Demonstration' and a horizontal line below it.

# FEWS NET Demonstration

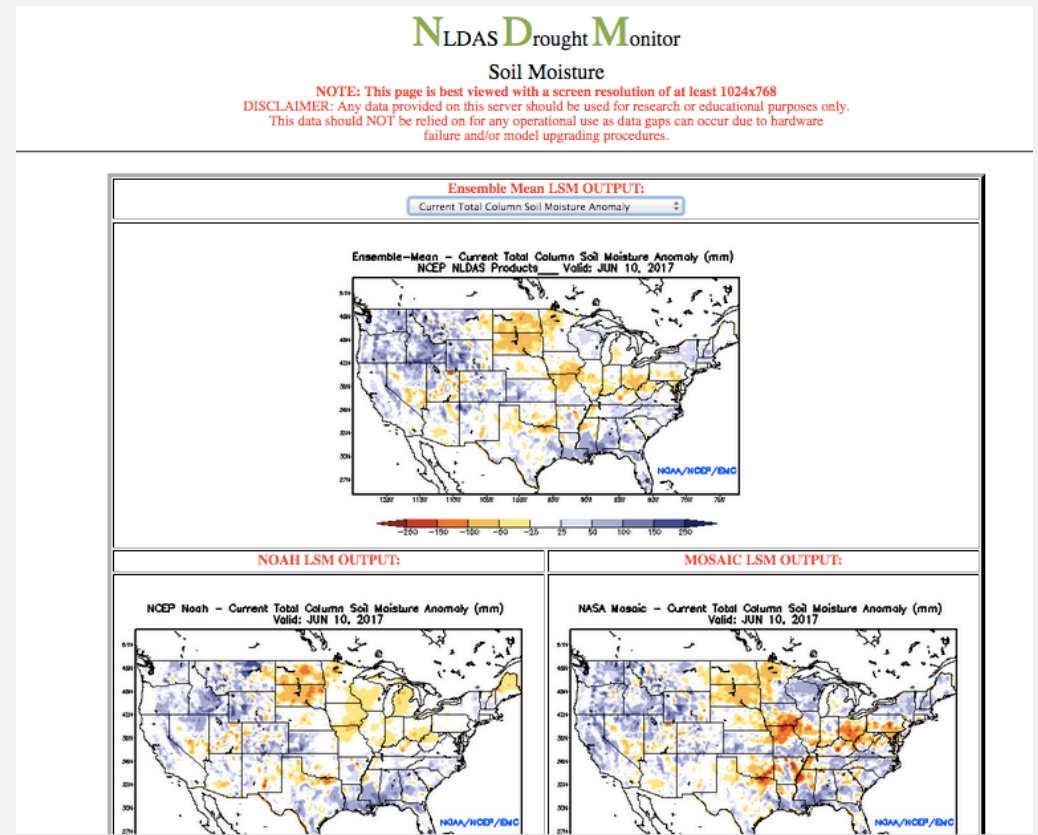
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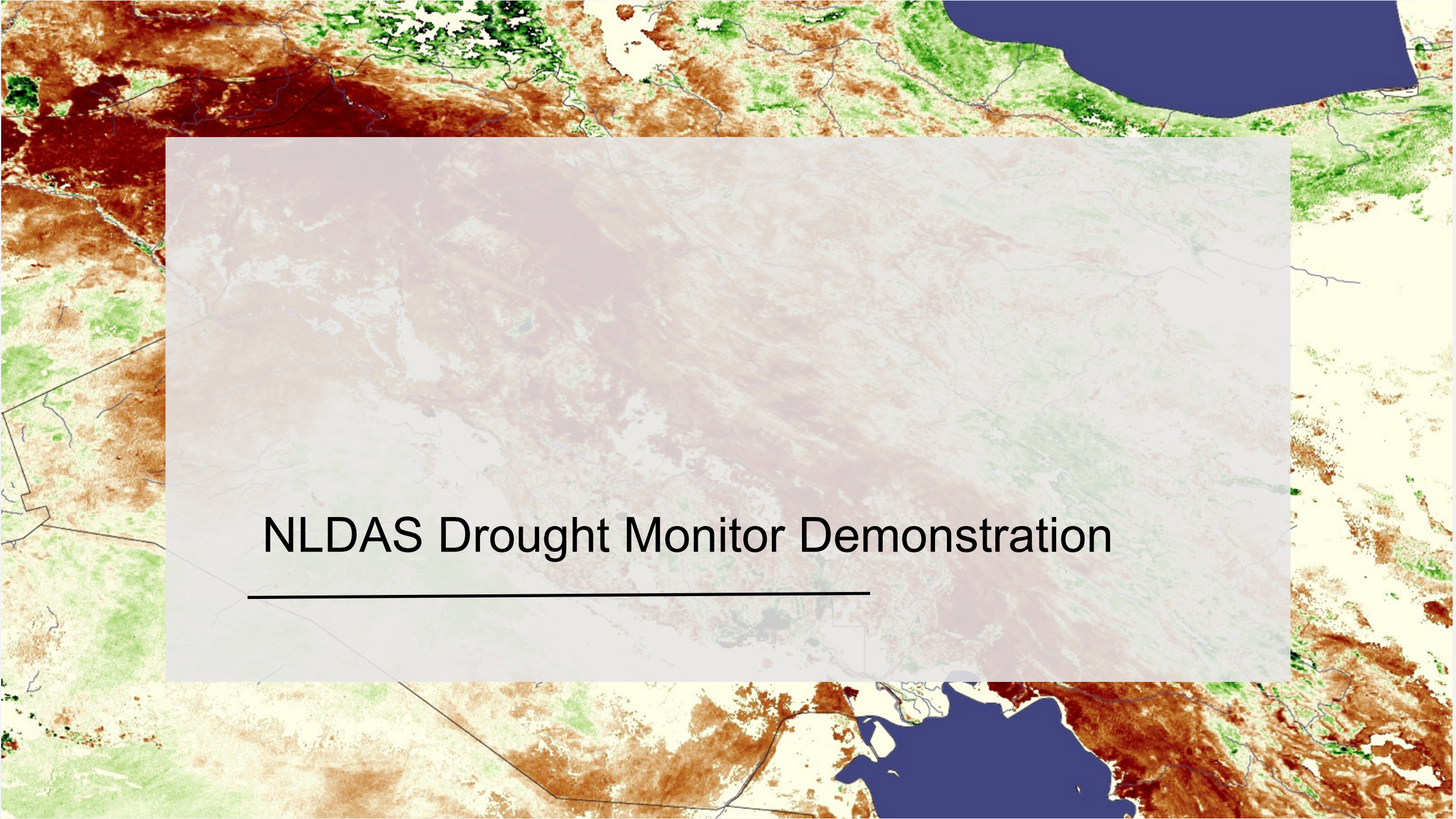


# North American Land Data Assimilation Drought Monitor

<http://www.emc.ncep.noaa.gov/mmb/nldas/drought/>

- Experimental drought monitor based on a land surface model that assimilates remote sensing observations
- North American Land Data Assimilation (NLDAS) model has four versions, including NASA MOSAIC, and Princeton University Visible Infiltration Capacity (VIC)
- For detailed information on NLDAS see Fundamentals of Remote Sensing: Session 2B
  - <http://arset.gsfc.nasa.gov/webinars/fundamentals-remote-sensing>



A topographic map of a region, likely the western United States, showing terrain elevation in shades of brown and green. A semi-transparent white rectangular box is overlaid on the map, containing the title text. The map also shows some blue areas representing water bodies and thin black lines for rivers or roads.

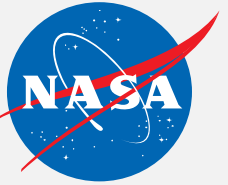
# NLDAS Drought Monitor Demonstration

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## Exercise: Download Precipitation, NDVI, and Soil Moisture Data

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## ARSET

Applied Remote Sensing Training

<http://arset.gsfc.nasa.gov>

 @NASAARSET

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# Thank You

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Next Week: Drought Monitoring Analysis and Application