

# **NASA's GRACE-based Drought/Wetness Indicators and Global LDAS**

**Matt Rodell\*, Hiroko Beaudoin, Bailing Li, Sujay  
Kumar, Ben Zaitchik, and Augusto Getirana**

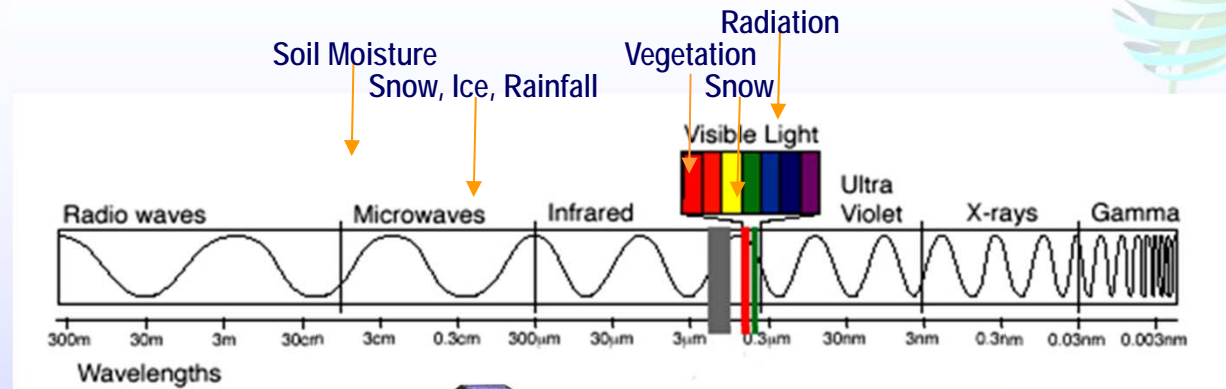
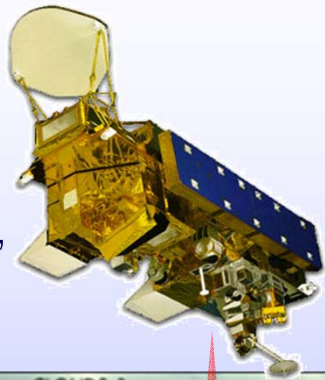
**\*Hydrological Sciences Laboratory  
NASA Goddard Space Flight Center  
Greenbelt, MD**



# Gravity Recovery and Climate Experiment (GRACE)



Aqua:  
MODIS,  
AMSR-E,  
etc.



Conventional radiation-based remote sensing technologies cannot sense water below the surface. GRACE is unique in its ability to monitor water at all levels, down to the deepest aquifer.

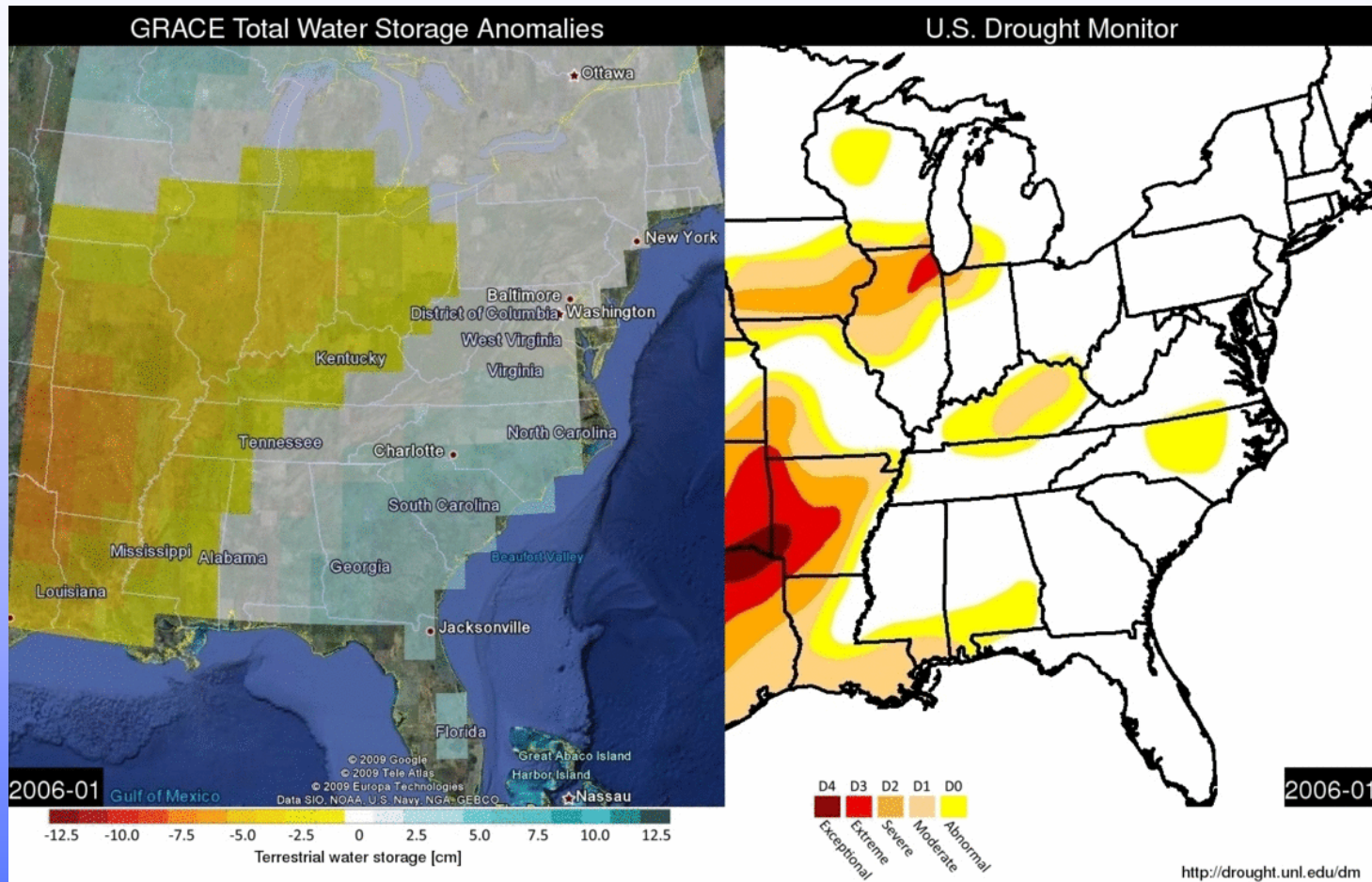




# GRACE Provides a Unique Perspective on Drought



GRACE observes groundwater and deep soil moisture, key indicators of drought



*GRACE captured the evolution of the 2007-08 drought in the southeastern U.S., and is now helping to improve drought monitoring and prediction*



## GRACE Hydrology: Challenges



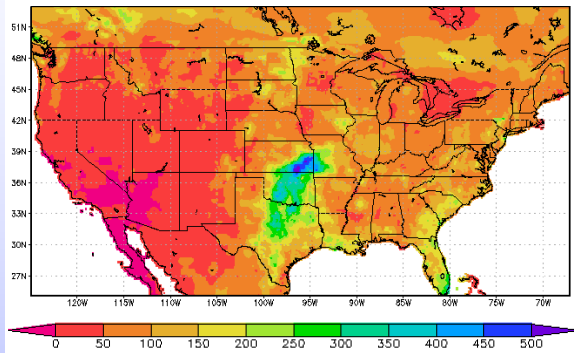
- Spatial resolution: 150,000 km<sup>2</sup> or coarser
  - Temporal resolution: 10-day to monthly
  - Data latency: possibly 2 weeks; typically 2-4 months
  - Lack of vertical information: observations convolve groundwater, soil moisture, surface water, snow
- 
- Why bother? Surface observation networks are inadequate and satellite gravimetry is the only remote sensing technology able to measure water below the first few centimeters of the land surface, including groundwater.



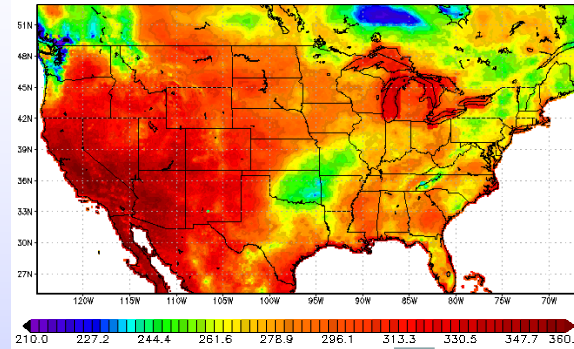
# Integration of GRACE and Other Data via Data Assimilation



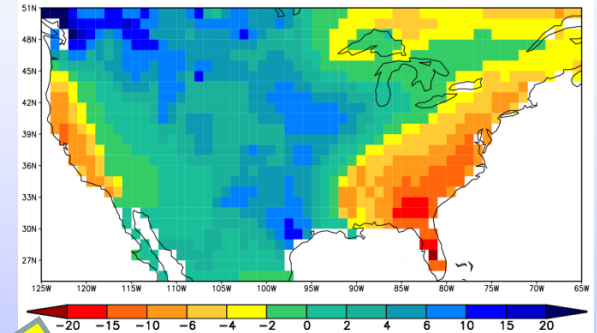
Precipitation (mm/month)



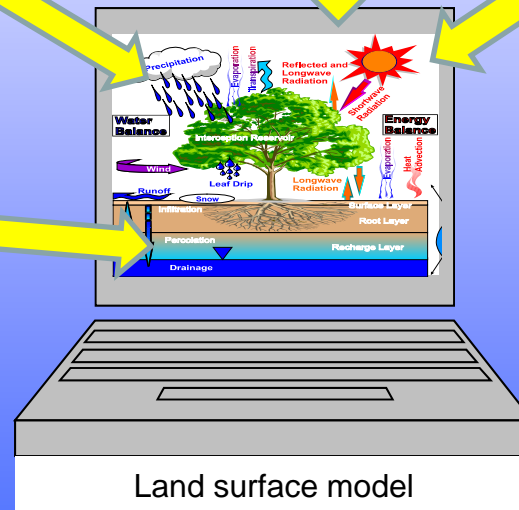
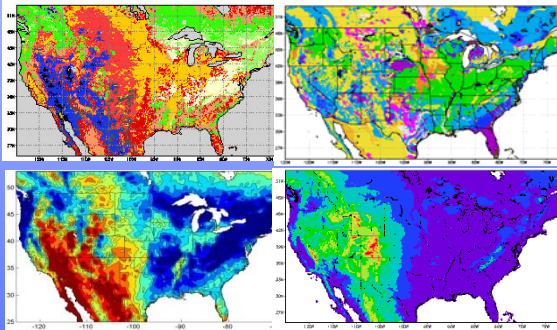
Solar Radiation (W/m<sup>2</sup>)



GRACE Water Storage Anomaly (cm)

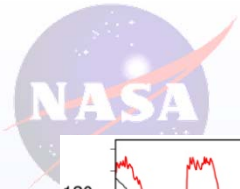


Other land surface properties and meteorological variables

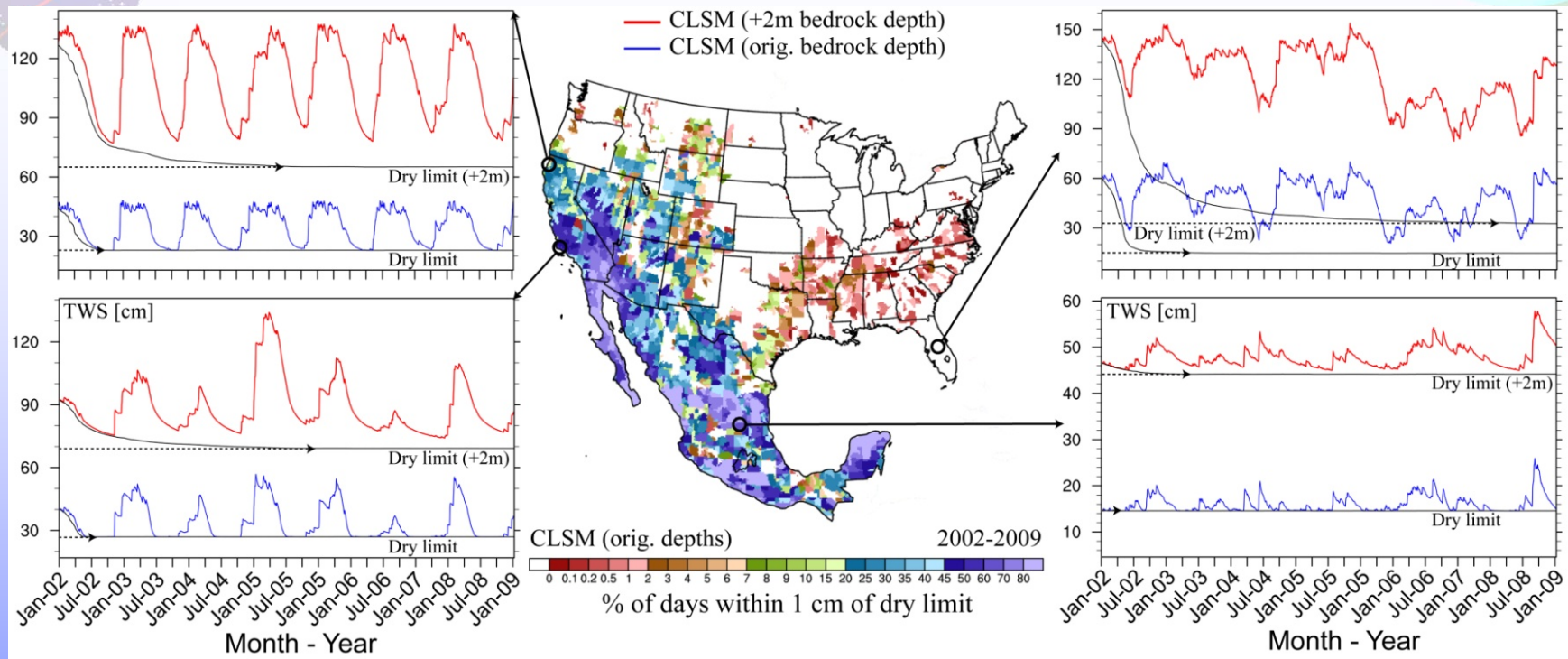
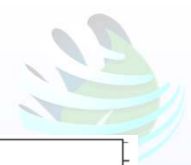


- Data assimilation combines modeled and observed estimates and error info to compute optimal estimates
- Ensemble smoother data assimilation (*Zaitchik et al., J. Hydromet., 2008*)
- Output has improved spatial, temporal, and vertical information





# Preparing for GRACE Data Assimilation



Houborg et al., WRR, 2012

- In some cases Catchment model TWS approached a “dry limit”, preventing full impact of GRACE data assimilation
  - Dry limit quantified (above) by open loop run with no precipitation
  - Particularly important for drought monitoring, but also for climatology
  - Problem addressed by increasing the depth to bedrock by 2 m
  - Unintended consequences for fluxes (e.g., runoff) determined to be minimal, but in some areas the mode of interannual GW variability increased to 20+ years
- Mask recently developed to prescribe +2m bedrock depth only as needed

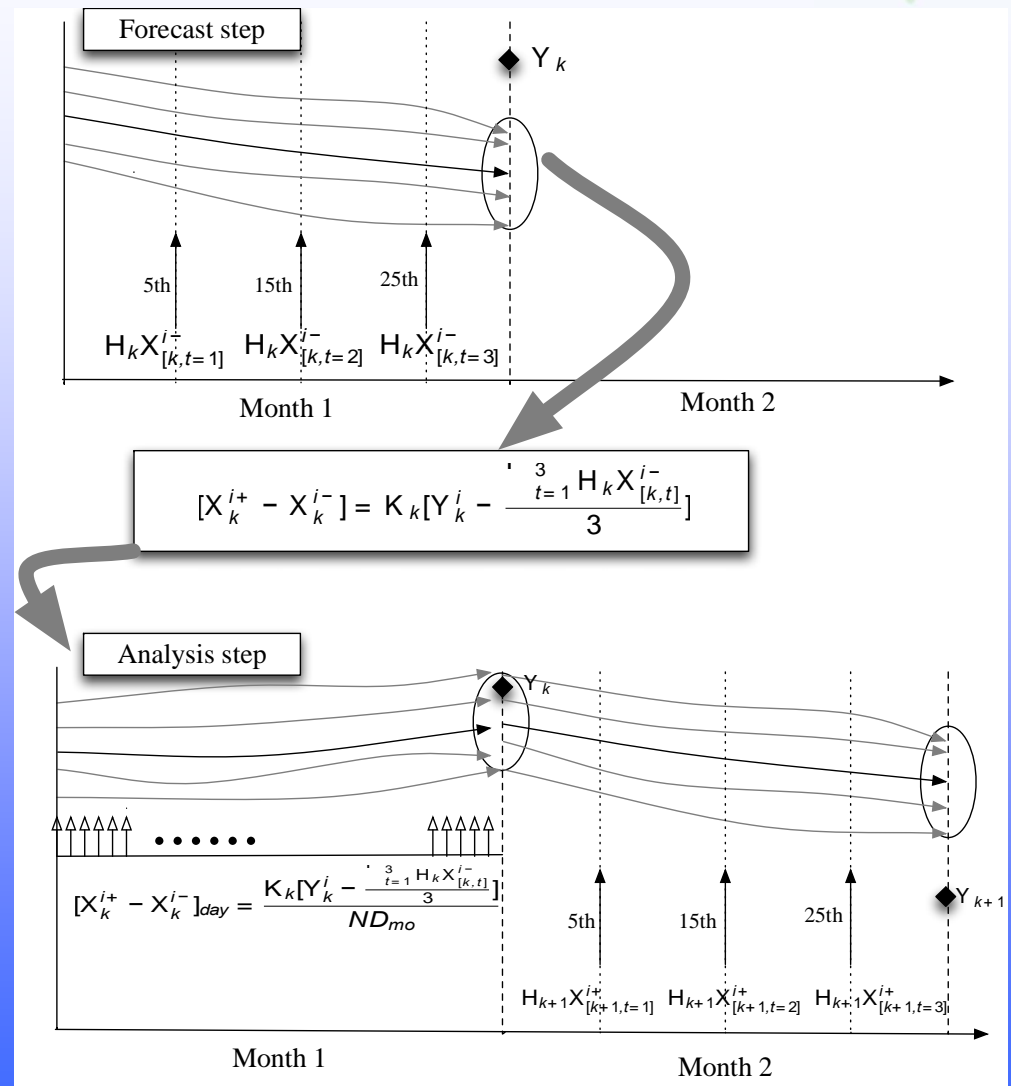
Matt Rodell  
NASA GSFC

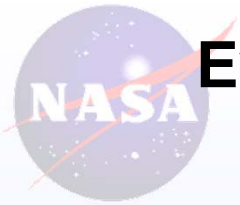


# New Gridded GRACE DA within LIS

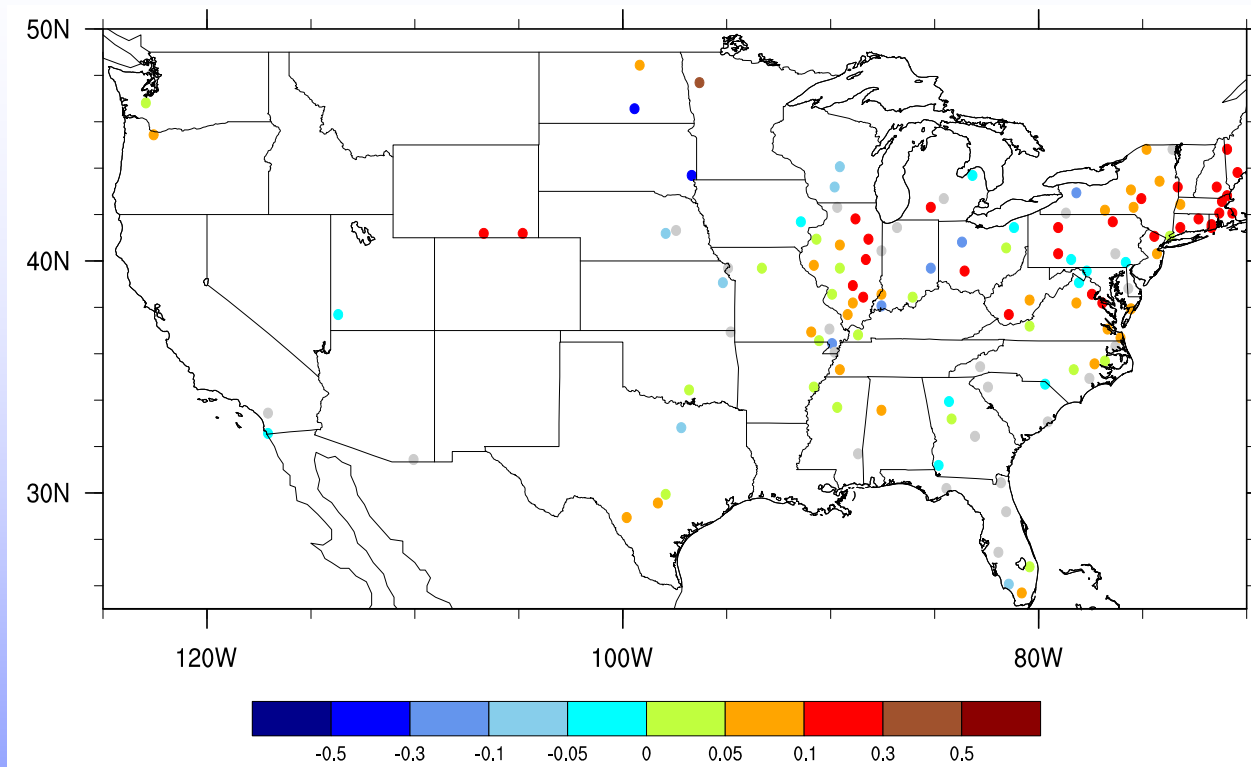


- Land Information System (LIS) is the software behind GLDAS
- Catchment land surface model w/ depth to bedrock increased by 2 m
- 3-dimensional Ensemble Kalman Smoother
- 20 member ensemble
- Assimilates gridded GRACE TWS anomaly fields as opposed to basin averages
- Horizontal error correlation scale ~300 km
- Prescribed uncertainty in the model and observation must be similar in magnitude, else the assimilated result will be dominated by one or the other





# Evaluation of Gridded GRACE DA: Groundwater



- Evaluation using quality controlled USGS groundwater well records
- Above: Anomaly R differences (DA - OL); warm colors indicate improvements due to DA, cool colors indicate degradations
- Right: Average improvement is significant

	OL	DA
Anomaly R	0.64 +/- 0.02	<b>0.69 +/- 0.02</b>



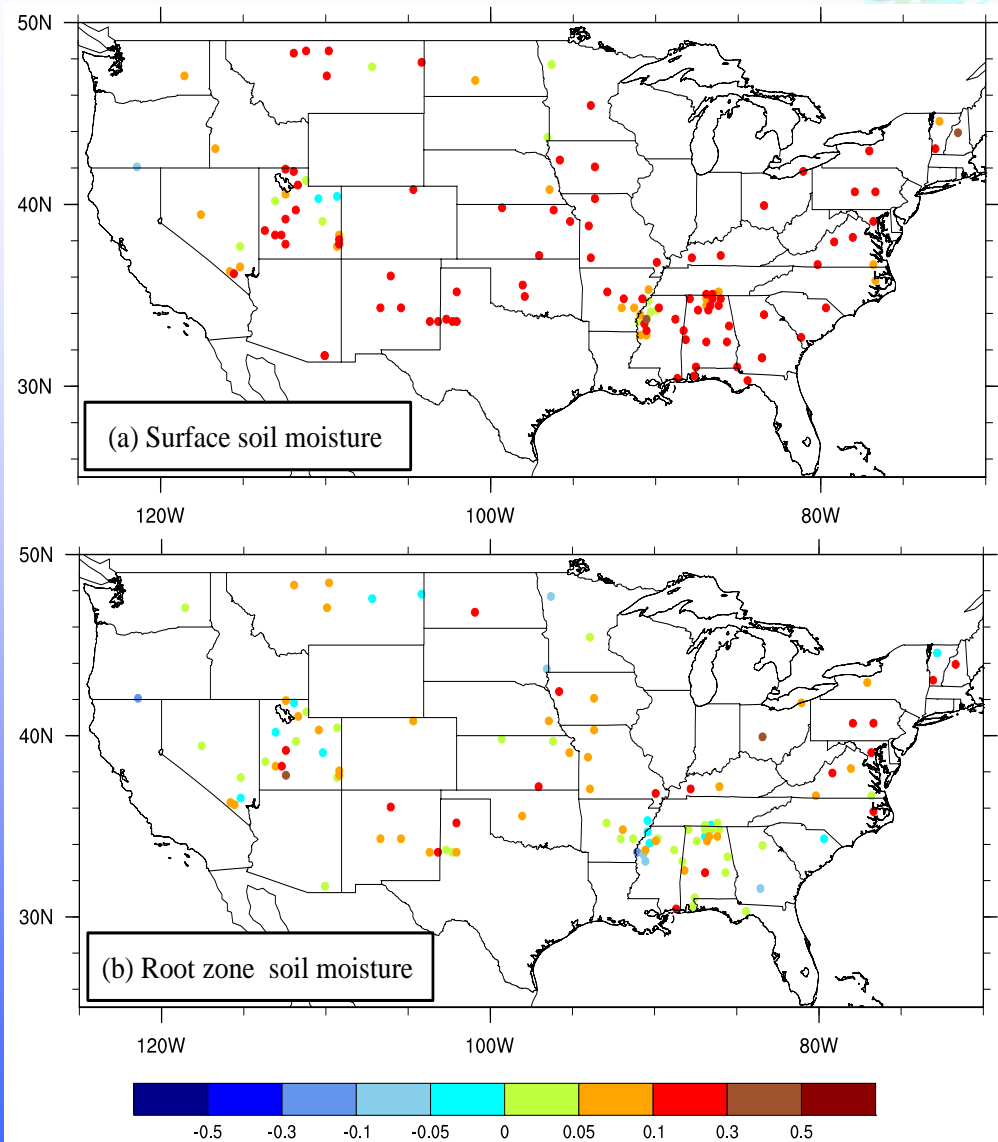


# Evaluation of Gridded GRACE DA: Soil Moisture



- Evaluation using USDA Agricultural Research Service (ARS) and Soil Climate Analysis Network (SCAN) soil moisture measurements
- Right: Anomaly R differences (DA - OL); warm colors indicate improvements due to DA, cool colors indicate degradations
- Below: Average improvement is significant

Anomaly R	OL	DA
Surface soil moisture	0.44+/- 0.02	<b>0.58 +/- 0.02</b>
Root zone soil moisture	0.48+/- 0.02	<b>0.54+/- 0.02</b>

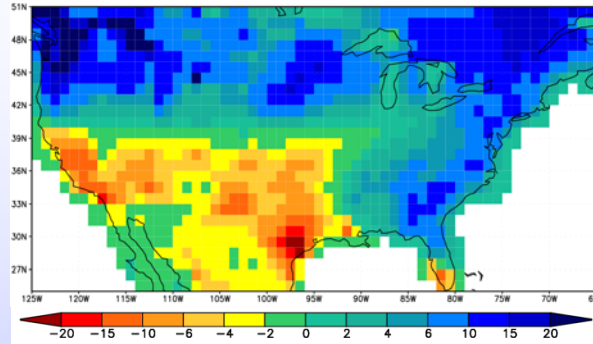




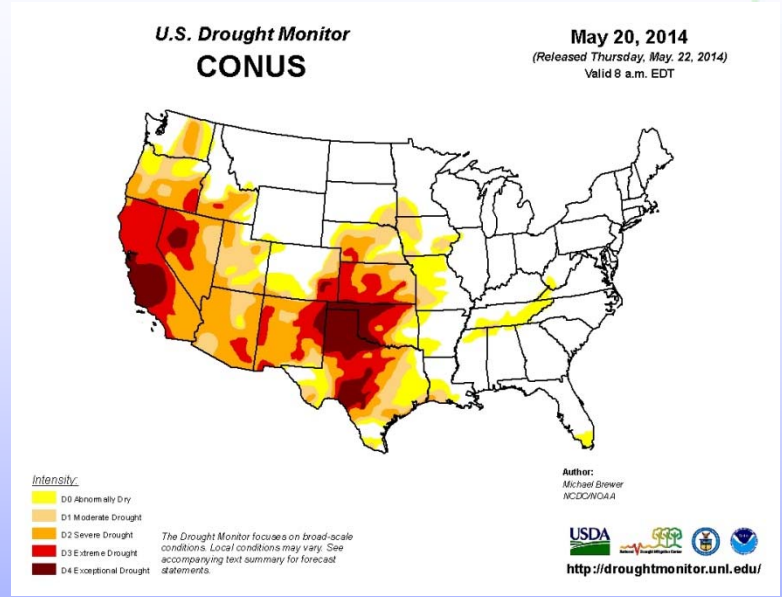
# GRACE Data Assimilation for Drought Monitoring



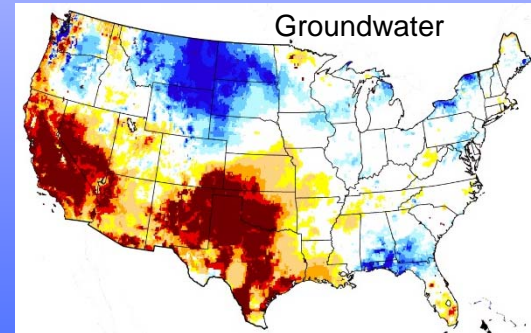
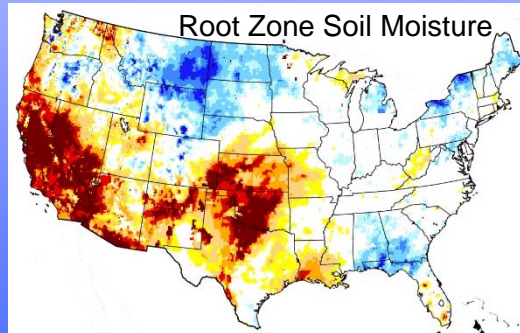
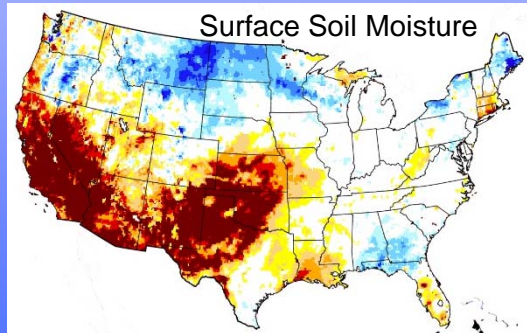
GRACE terrestrial water storage anomalies (cm equivalent height of water) for May 2014 (Tellus CSR RL05 scaled).



New process integrates data from GRACE and other satellites to produce timely information on wetness conditions at all levels in the soil column, including groundwater. For current maps and more info, see <http://www.drought.unl.edu/MonitoringTools.aspx>



U.S. Drought Monitor product for 20 May 2014.



Drought indicators from GRACE data assimilation (wetness percentiles relative to the period 1948-present) for 19 May 2014.



# GRACE DA Based Drought Indicators



- 1948 to 2012 “open loop” (no DA) Catchment LSM simulation provides background climatology
- 2002 to present Catchment LSM simulation with GRACE DA adjusted to be consistent with the climatology using the overlapping period
- NLDAS2 observation-based meteorological forcing (precipitation, solar radiation, etc.) enables extrapolation of GRACE TWS information
- Groundwater and root zone and surface soil moisture outputs are converted to percentiles based on CDF of the long term climatology
- Data and maps are used by the U.S. Drought Monitor authors and posted on a weekly basis at <http://drought.unl.edu/MonitoringTools.aspx>

The screenshot shows a web page from the National Drought Mitigation Center. The main heading is "Groundwater and Soil Moisture Conditions from GRACE Data Assimilation". Below the heading, there are three maps of the United States, each representing a different percentile: "Groundwater Percentile", "Root Zone Soil Moisture Percentile", and "Surface Soil Moisture Percentile". Each map is color-coded, with red and orange indicating drier conditions and blue and green indicating wetter conditions. Below the maps, there is a "Non-Technical Description" and a "Technical Description" section. The "Non-Technical Description" explains that the data is derived from GRACE satellite data and is used to assess groundwater and soil moisture conditions. The "Technical Description" provides more details about the data processing and the use of percentiles. At the bottom of the page, there is a "References" section with two citations and a "More Information" section with a link to the data.

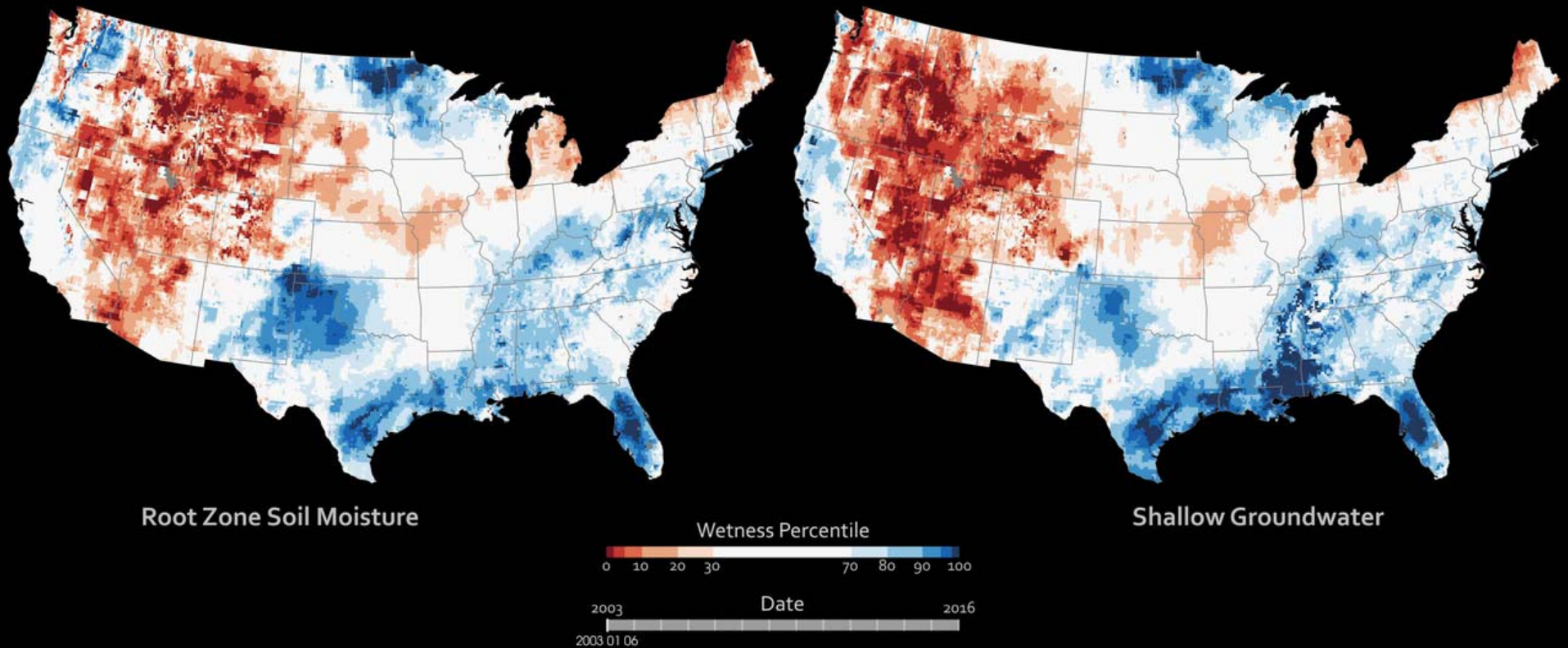




# GRACE-DA Drought Indicators



## Monitoring Drought from Space



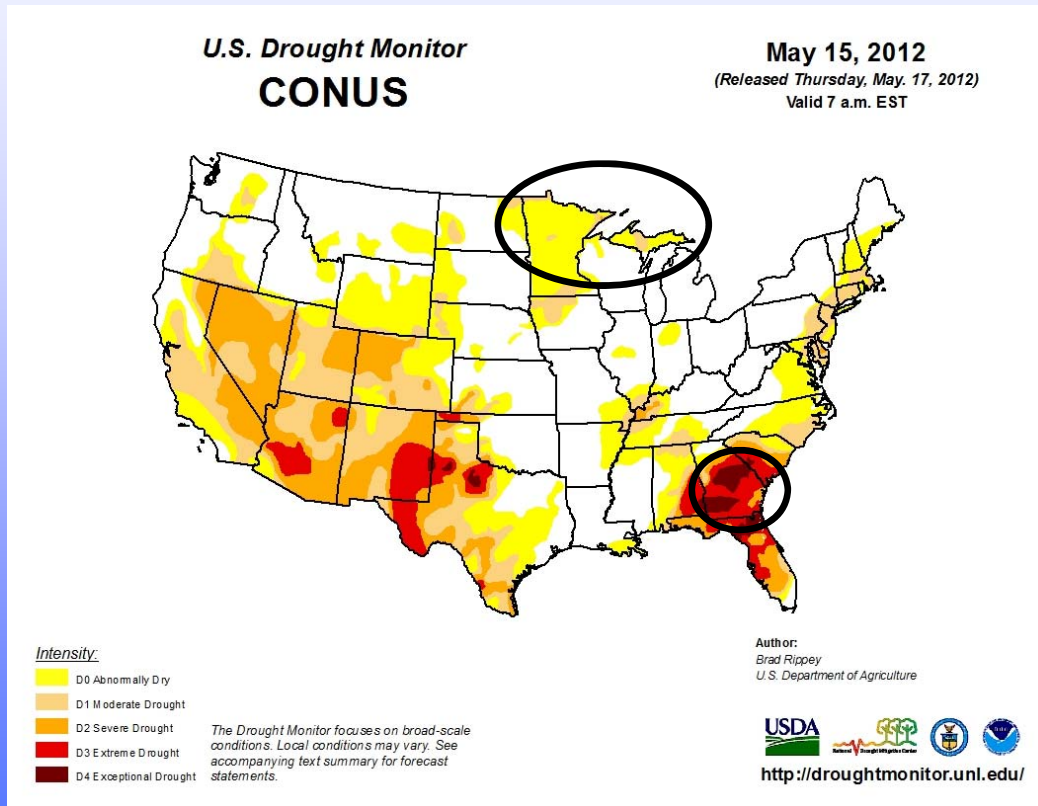
Visualization prepared by Marit Jentoft-Nilsen, NASA/GSFC

Matt Rodell  
NASA GSFC

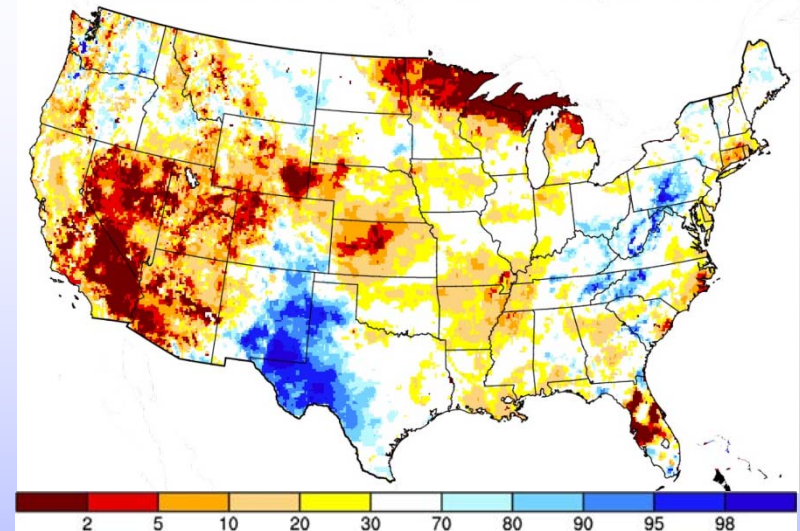




# The Persistence of Deep Drought

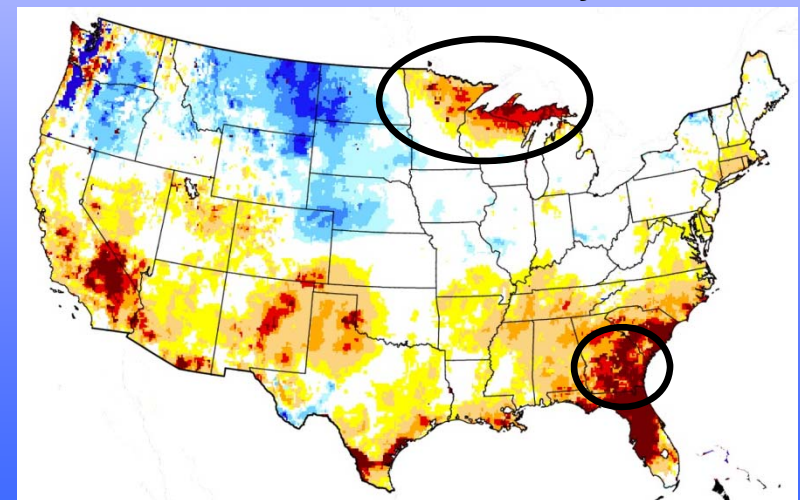


## Surface Soil Moisture Drought/Wetness Indicator from GRACE DA, May 14, 2012



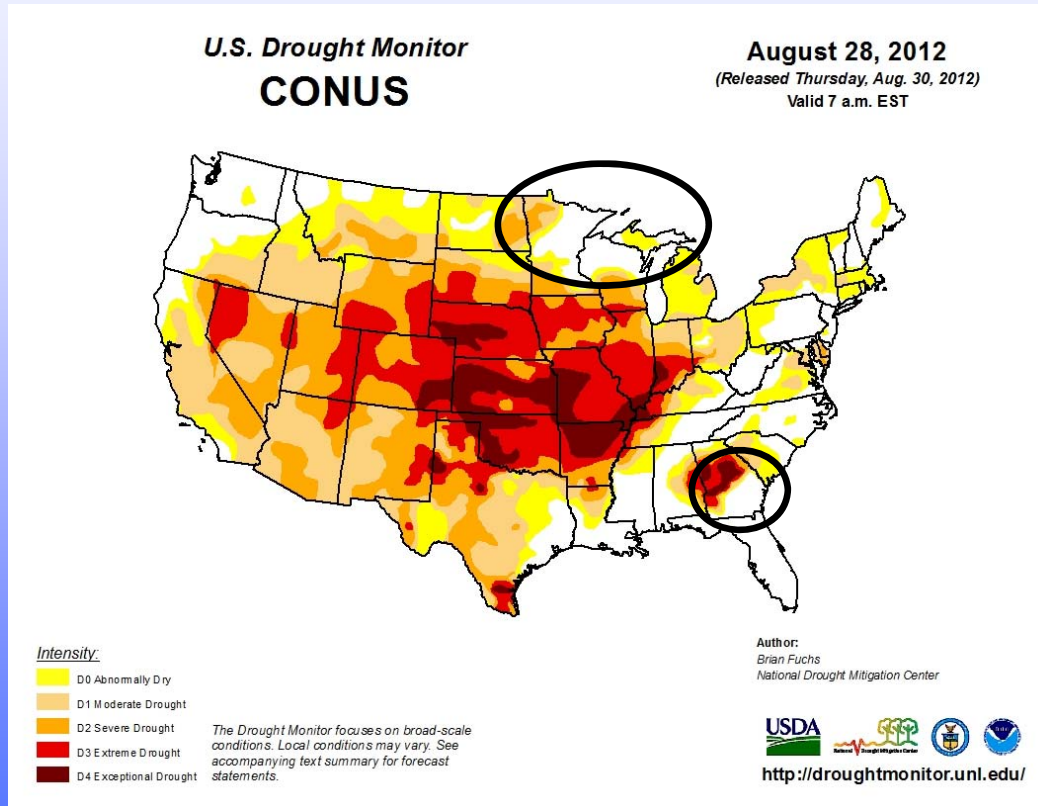
Wetness percentile relative to the period 1948-present

## Shallow Groundwater Drought/Wetness Indicator from GRACE DA, May 14, 2012

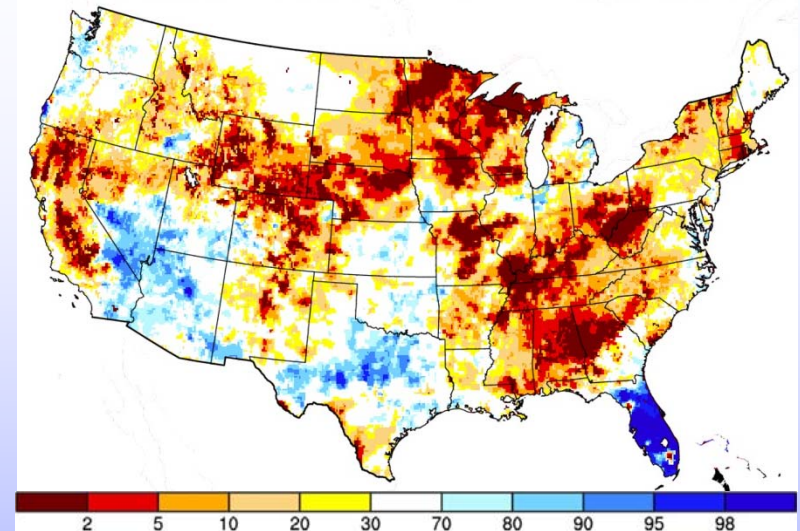




# The Persistence of Deep Drought

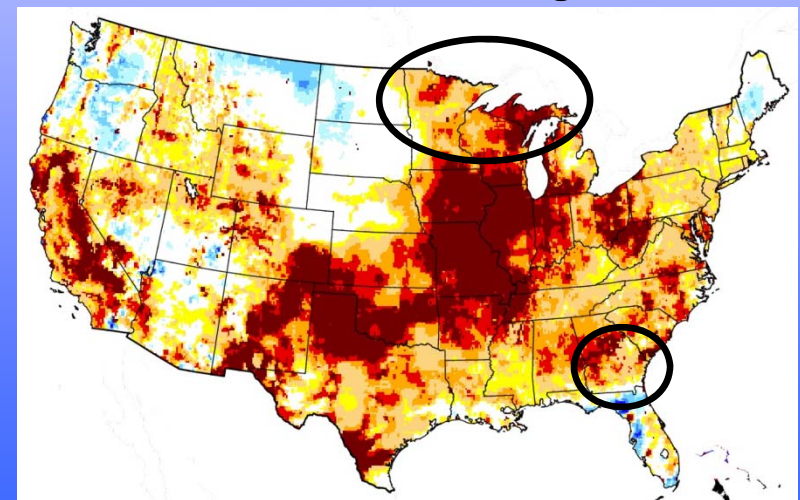


## Surface Soil Moisture Drought/Wetness Indicator from GRACE DA, August 27, 2012



Wetness percentile relative to the period 1948-present

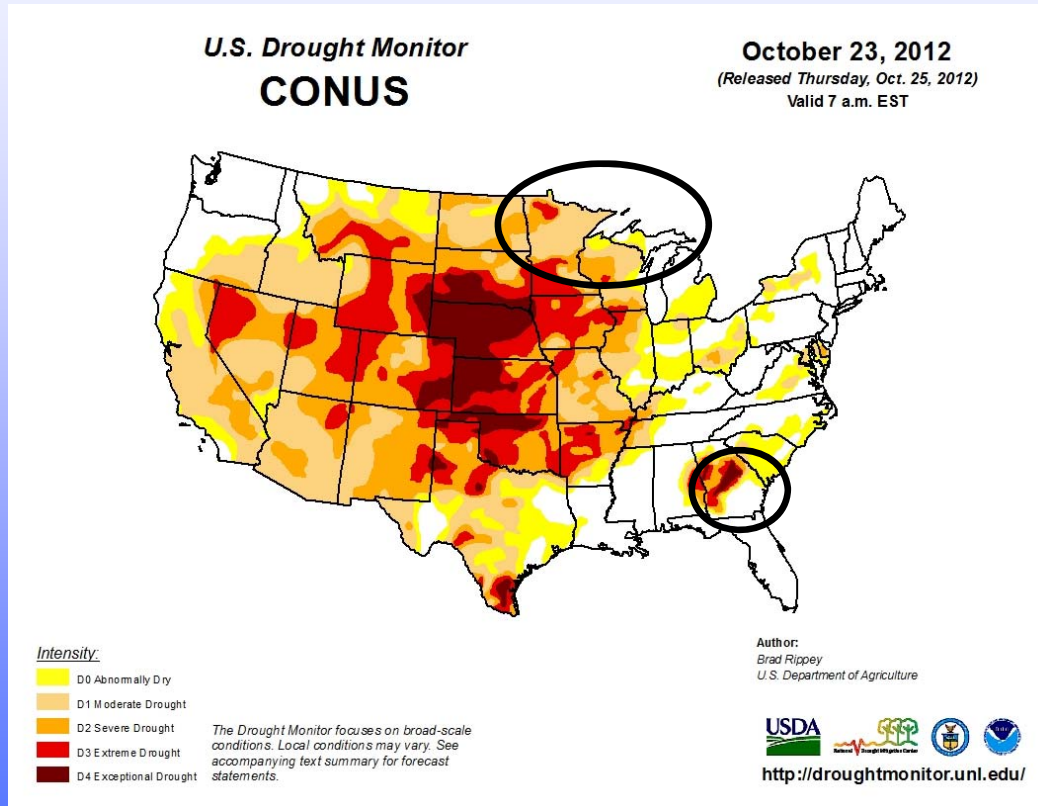
## Shallow Groundwater Drought/Wetness Indicator from GRACE DA, August 27, 2012



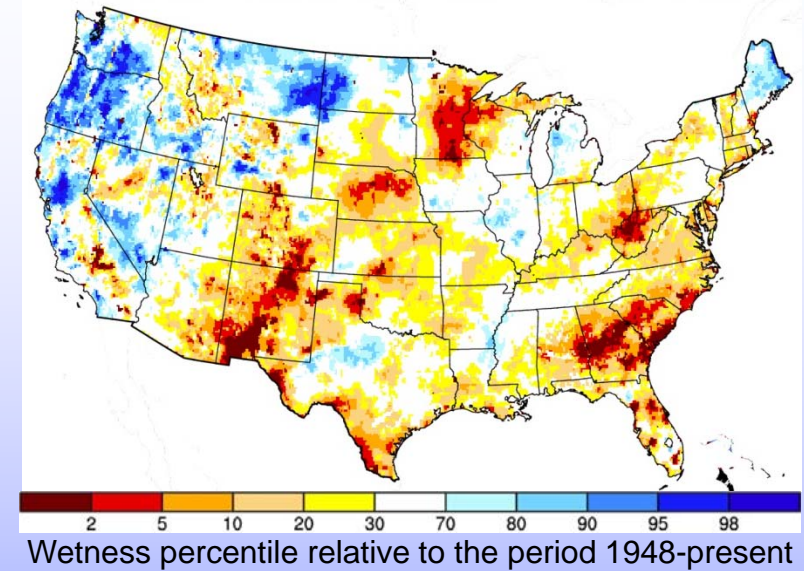




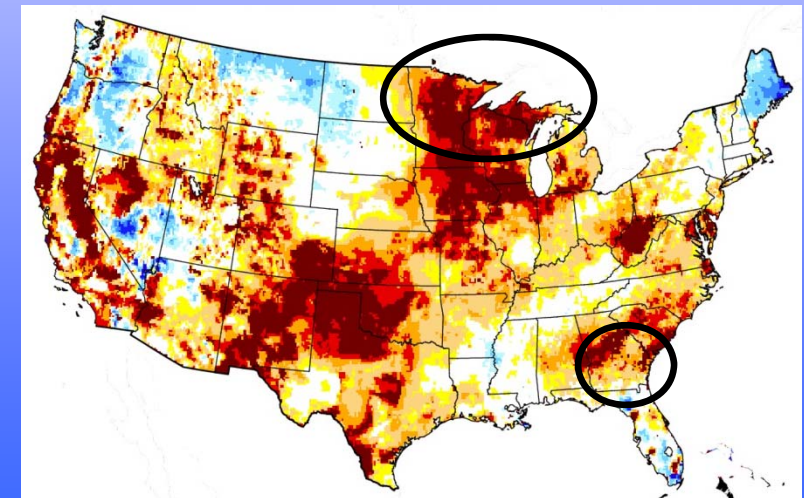
# The Persistence of Deep Drought



## Surface Soil Moisture Drought/Wetness Indicator from GRACE DA, October 23, 2012



## Shallow Groundwater Drought/Wetness Indicator from GRACE DA, October 23, 2012

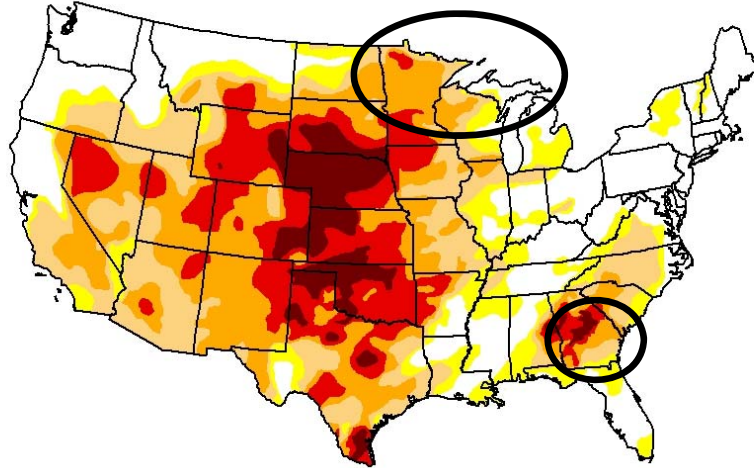




# The Persistence of Deep Drought

U.S. Drought Monitor  
CONUS

December 25, 2012  
(Released Thursday, Dec. 27, 2012)  
Valid 7 a.m. EST



**Intensity:**

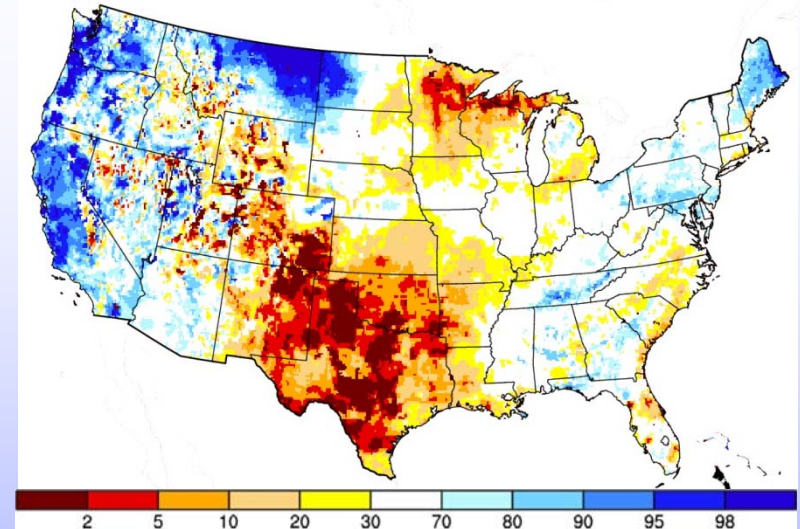
- D0 Abnormally Dry
- D1 Moderate Drought
- D2 Severe Drought
- D3 Extreme Drought
- D4 Exceptional Drought

*The Drought Monitor focuses on broad-scale conditions. Local conditions may vary. See accompanying text summary for forecast statements.*

Author:  
Richard Heim  
NCDC/NOAA

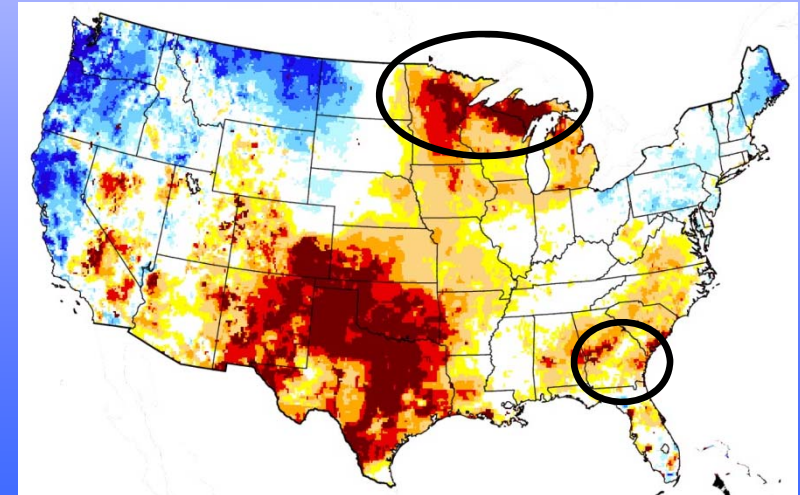


## Surface Soil Moisture Drought/Wetness Indicator from GRACE DA, December 24, 2012



Wetness percentile relative to the period 1948-present

## Shallow Groundwater Drought/Wetness Indicator from GRACE DA, December 24, 2012



Matt Rodell  
NASA GSFC

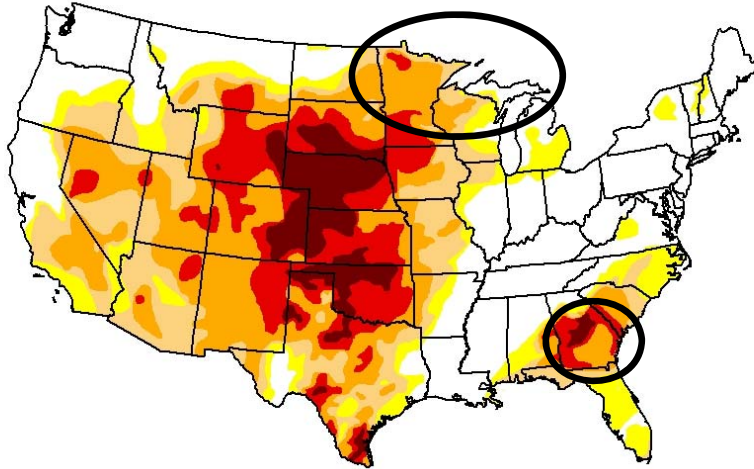




# The Persistence of Deep Drought

U.S. Drought Monitor  
CONUS

February 5, 2013  
(Released Thursday, Feb. 7, 2013)  
Valid 7 a.m. EST



**Intensity:**

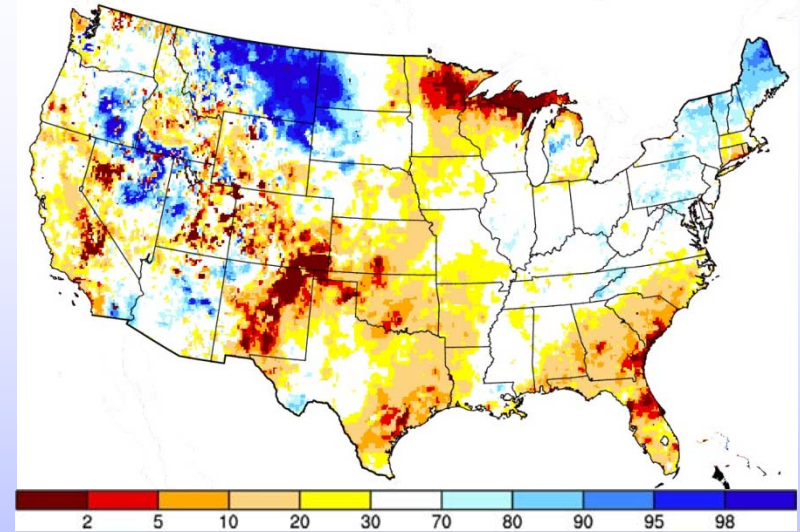
- D0 Abnormally Dry
- D1 Moderate Drought
- D2 Severe Drought
- D3 Extreme Drought
- D4 Exceptional Drought

*The Drought Monitor focuses on broad-scale conditions. Local conditions may vary. See accompanying text summary for forecast statements.*

Author:  
Michael Brewer  
NCDC/NOAA

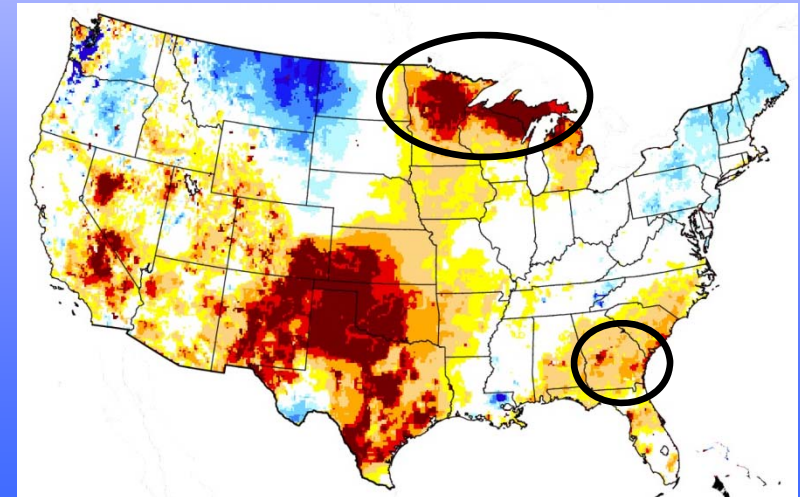


## Surface Soil Moisture Drought/Wetness Indicator from GRACE DA, February 4, 2013



Wetness percentile relative to the period 1948-present

## Shallow Groundwater Drought/Wetness Indicator from GRACE DA, February 4, 2013



Matt Rodell  
NASA GSFC

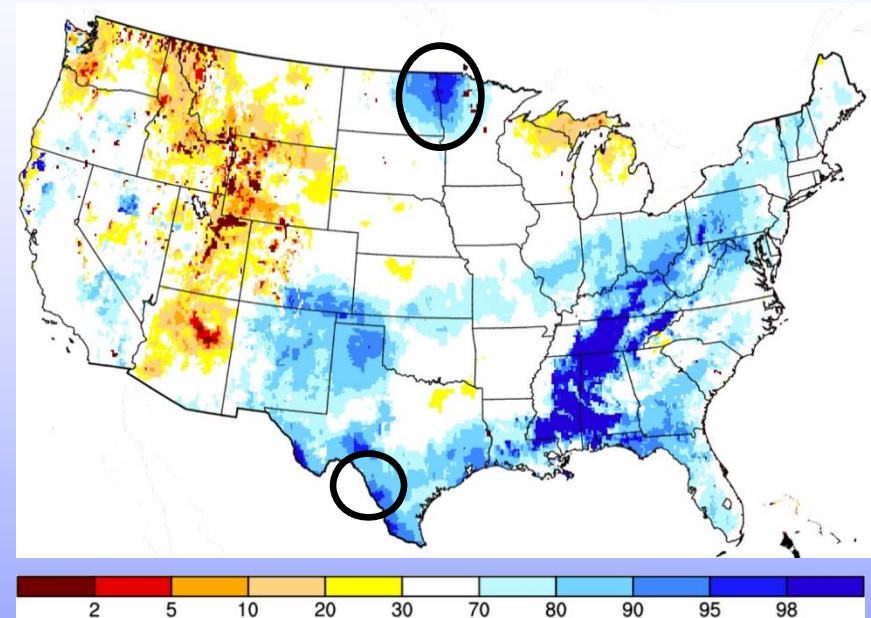
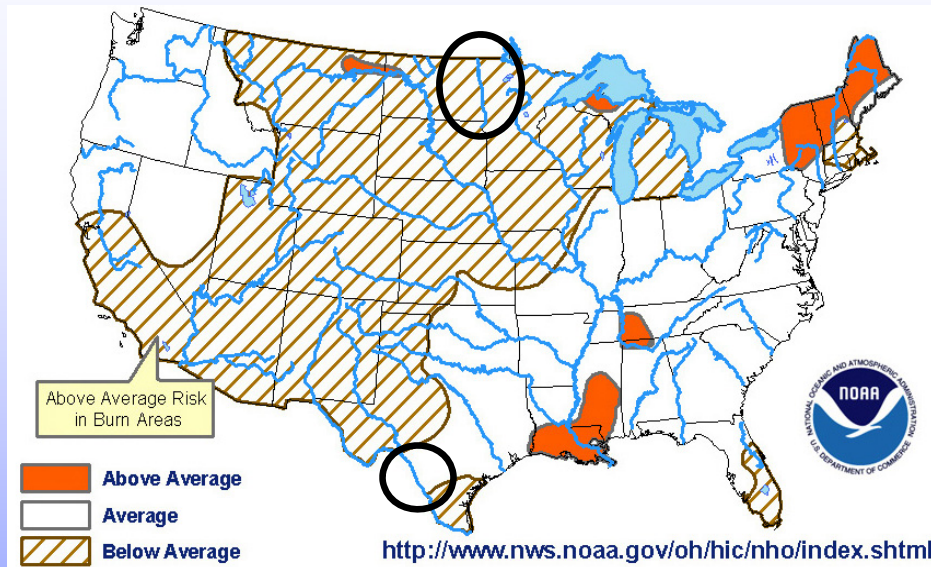


# Antecedent Conditions → Flood Forecast Potential



NOAA's Spring Flood Risk Assessment  
Issued March 12, 2004

Shallow Groundwater Drought/Wetness  
Indicator from GRACE DA, March 8, 2004



Wetness percentile relative to the period 1948-present

## From the Dartmouth Flood Observatory

March 28 – April 11, 2004: “Extensive overland flooding in rural areas of the Red River valley.” Dead: none. Displaced: 1,000. Damage: \$4.5M.

April 4-6, 2004 - “Flooding some of the worst in the history of the U.S.-Mexico border region.” Dead: 37. Displaced: 3,500. Damage: ??

Note 1: Wet antecedent conditions are neither a guaranty of nor a prerequisite for flooding.

Note 2: NOAA correctly forecasts spring flooding more often than not.

Matt Rodell  
NASA GSFC



# Flood and Drought Forecasting



**Premise:** Terrestrial water storage has significant “memory” → antecedent conditions that influence drought and flood severity.

**Goal:** Develop 30-90 day,  $0.125^\circ$  gridded predictions of soil moisture and groundwater conditions and runoff for the continental U.S., and test them as inputs to existing drought, river flow, and flood decision support systems.

## Key Datasets

- GRACE and GRACE FO TWS anomalies (U. Texas “regularized” fields)
- Princeton and NLDAS-2 meteorological forcing
- NASA GEOS-5 seasonal forecasts

## Model

- NASA’s Land Information System (LIS) software infrastructure
- Catchment Land Surface Model
- Gridded, ensemble smoother GRACE data assimilation



# NASA's Land Data Assimilation Systems



## North American LDAS

- NOAA, NASA, (and 6 other US institutions) 1998-present
- 1/8 degree resolution, central North America

## Global LDAS

- An instance of LIS with a massive archive of input and output data
- NASA (and NOAA) 2000-present
- 1/4 and 1.0 degree resolutions, all land 60S-90N

## Land Information System (LIS)

- NASA 2002-present
- Software configurable for any domain and resolution
- Multiple data assimilation options
- Can be run uncoupled or coupled to an atmospheric model
- Adopted by all other NASA LDAS projects & NOAA & AFWA

**Others:** MERRA-Land; European LDAS; Middle East North Africa (MENA) LDAS; South American LDAS; LDAS-University of Tokyo; etc.



## GLDAS operations—1) Incoming data\*

Dataset	Function	Download size / daily	Raw+processed Size / year	Coverage	Archive size	Source
GDAS	Forcing	976 MB (*30)	31-420 GB	2000/01 ~	2.4 TB	NCEP
ECMWF	Forcing	139 MB	48 GB	2001/09 ~	1.7 TB	ECMWF
NLDAS2	Forcing	45.6 MB	16 GB	1979 ~	560 GB	NCEP/NASA
AFWA radiation	Forcing	1060 MB	582 GB	2001/03 ~	2.5 TB	AFWA/AGRMET-LIS
MODIS SNOW	Assimilation	3.8 MB	7.3 GB	2000/02 ~	102 GB	NASA
CMAF pentad	Forcing		0.63 GB	2001/01 ~	54 GB	CPC
Princeton	Forcing		5 GB	1948-2010	315 GB	Sheffield et al 2006
AFWA 3-hourly	Analysis	184 MB	13-61 GB	2001/10 ~	257 GB	AFWA/AGRMET-LIS
CMORPH 8km	Forcing	28 MB	9.6 GB	2002/12	107 GB	CPC

### Table of active GLDAS incoming datasets

Green background is downloaded/processed daily, Yellow--once a month, Gray—occasionally (also GRACE).

Downloading is fully automated in all datasets.

Preprocessing is automated for GDAS and ECMWF while manual processing is required for AFWA radiation, MODIS SNOW, and CMAF disaggregation (for now).

Current disk usage: Forcing ~ 12 TB; Parameter ~ 1.3 TB; Satellite observation data sets to come for assimilation

\*As of 1 April 2014



<http://disc.gsfc.nasa.gov/hydrology>

- Access via GDS, FTP, or quick-look visualization in Giovanni (below right)
- GRIB and NetCDF formats
- 3-hourly and monthly; 1.0° and 0.25° global grids
- On-the-fly subsetting (below center)
- Full documentation
- GLDAS supports a growing number of national and international hydrometeorological investigations and water resources applications

# GLDAS Data Availability



## GLDAS V1

1.0°, 1979-present: Noah, CLM2, Mosaic, VIC

0.25°, 2000-present: Noah w/ MODIS snow cover assimilation

Forcing: Berg et al. (2003) for 1979-1999, GDAS + CMAP + AGRMET for 2000-present

## GLDAS V2

1.0°, 1948-present: Noah

1.0°, 2001-present: CLM3.5, Mosaic, VIC

0.25°, 2000-present: Noah w/ improved MODIS snow cover assimilation

Forcing: Princeton for 1948-2000, GDAS + TMPA + AGRMET for 2001-present

**GES DISC** Hydrology

Showing (32) datasets associated with Hydrology...

Image	Dataset	Source	Temporal Resolution	Spatial Resolution	Process Level	Begin Date	End Date
	GLDAS Noah Land Surface Model L4 monthly 0.25 x 0.25 degree Version 2.0 (GLDAS_NOAH025_M_020) - Atmospheric Pressure, Atmospheric Radiation, Atmospheric Temperature	Models/Analyses Noah-LSM	1 month	0.25° x 0.25°	4	1948-01-01	2010-12-31
	GLDAS Noah Land Surface Model L4 monthly 1.0 x 1.0 degree Version 2.0 (GLDAS_NOAH10_M_020) - Atmospheric Pressure, Atmospheric Radiation, Atmospheric Temperature	Models/Analyses Noah-LSM	1 month	1° x 1°	4	1948-01-01	2010-12-31
	GLDAS Noah Land Surface Model L4 3 hourly 0.25 x 0.25 degree Version 2.0 (GLDAS_NOAH025_3H_020) - Atmospheric Pressure, Atmospheric Radiation, Atmospheric Temperature	Models/Analyses Noah-LSM	3 hours	0.25° x 0.25°	4	1948-01-01	2010-12-31
	GLDAS Noah Land Surface Model L4 3 hourly 1.0 x 1.0 degree Version 2.0 (GLDAS_NOAH10_3H_020) - Atmospheric Pressure, Atmospheric Radiation, Atmospheric Temperature	Models/Analyses Noah-LSM	3 hours	1° x 1°	4	1948-01-01	2010-12-31
	NLDAS Secondary Forcing Data L4 Monthly 0.125 x 0.125 degree (NLDAS_FORB0125_M_002) - Altitude, Atmospheric Pressure, Atmospheric Radiation	Models/Analyses Forcing-LSM	1 month	0.125° x 0.125°	4	1979-01-01	present
	NLDAS Secondary Forcing Data L4 Hourly 0.125 x 0.125 degree (NLDAS_FORB0125_H_002) - Altitude, Atmospheric Pressure, Atmospheric Radiation	Models/Analyses Forcing-LSM	1 hour	0.125° x 0.125°	4	1979-01-01	present

**Global Land Data Assimilation System (GLDAS)**  
0.25 Degree Monthly Products

Visualization Results | Download Data | Product Lineage | Acknowledgment Policy

GLDAS\_NOAH025\_M.001 Total evapotranspiration [(10<sup>-5</sup>)kg/m<sup>2</sup>/s] (Jun2015)

Legend: -0.731, 0.985, 2.702, 4.418, 6.135, 7.861

\* Applies to the whole results set (all plots)



# GLDAS Data Usage



## Download Statistics from the GES DISC

Month	Unique Users	Files	Volume (TB)
2013-04	346	1,341,642	2.01
2013-05	359	1,907,570	2.17
2013-06	398	874,131	1.31
2013-07	370	1,055,181	2.35
2013-08	331	810,217	2.25
2013-09	418	1,037,359	2.99
2013-10	321	3,538,842	3.24
2013-11	544	7,112,971	5.28
2013-12	477	4,363,910	7.10
2014-01	452	3,911,171	4.08
2014-02	523	3,032,037	4.33
2014-03	753	5,342,619	10.48



# GLDAS Future Plans



- GLDAS2.1 will replace GLDAS1.0 multi-model products for 2001 onwards:
  - 1) Add other/updated LSMs:
    - a) LIS7/Noah 3.3 [available from HDISC for 1948-2010 @ 1° & 0.25°]
    - b) LIS7/Catchment Fortuna 2.5 [completed for 1948-2012 @ 1°; in prep for HDISC ]
    - c) LIS7/VIC 4.12 [modifying Shugong's global parameter dataset of VIC4.11 with MODIS44W land mask and 60S-90N extent]
    - d) CLM4.5 [originally planned for stand alone, now awaiting integration in LIS]
  - 2) Reprocess CMAP with new disaggregation code and post-processed pentad CMAP [CMAP real-time pentad product has drift; old disaggregation process caused inconsistencies] [complete]
  - 3) Improve QC/QA for AGRMET Shortwave radiation, bias-correct to SRB data [complete]
  - 4) Runoff routing using Augusto Getirana's code in LIS7
- Runoff routing for GLDAS2.0 1948-2012 output (Princeton V2 forced Noah 3.3, 1.0° and 0.25°)
- GLDAS2.2 will assimilate MODIS snow cover and AMSR-E soil moisture at 0.25° for 2002 onwards
- Global implementation of irrigation simulation schemes
- Extending U.S. drought/wetness indicators to global scale [ongoing under a NASA project]
- Seasonal forecast drought/wetness indicators for the U.S. [ongoing under a new NASA project]