

# The Western Land Data Assimilation System and Drought Monitoring in Colorado

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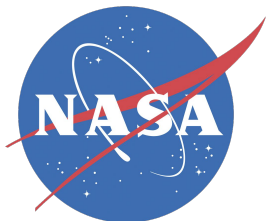
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Project Partners: Russ Schumacher and Peter Bennett Goble (CCC)

**Bailing Li (UMD/GSFC)**

Scott Rheingrover (SAIC)

April 30, 2024



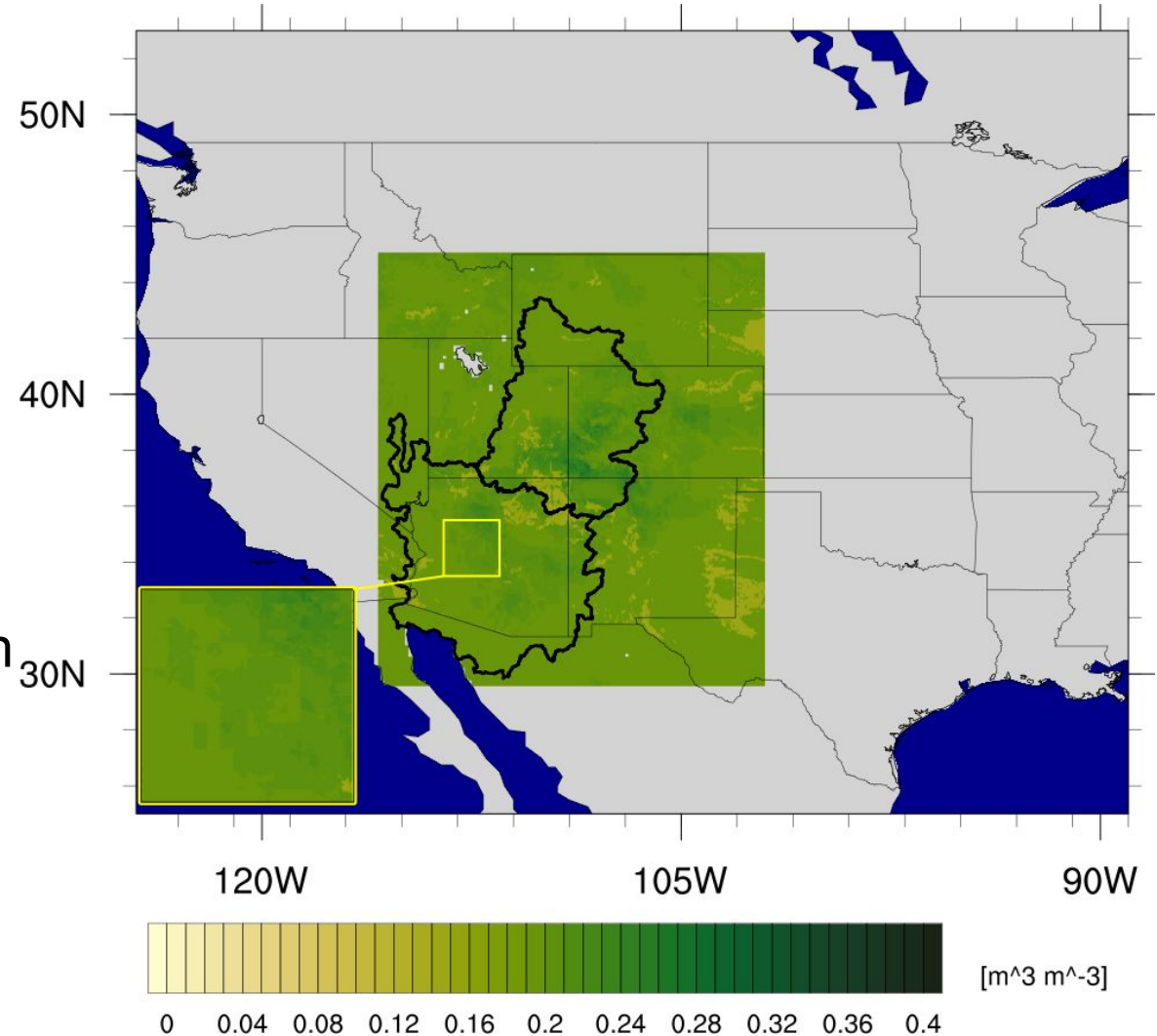
# Motivation

**Goal:** Support decision makers with data on water availability

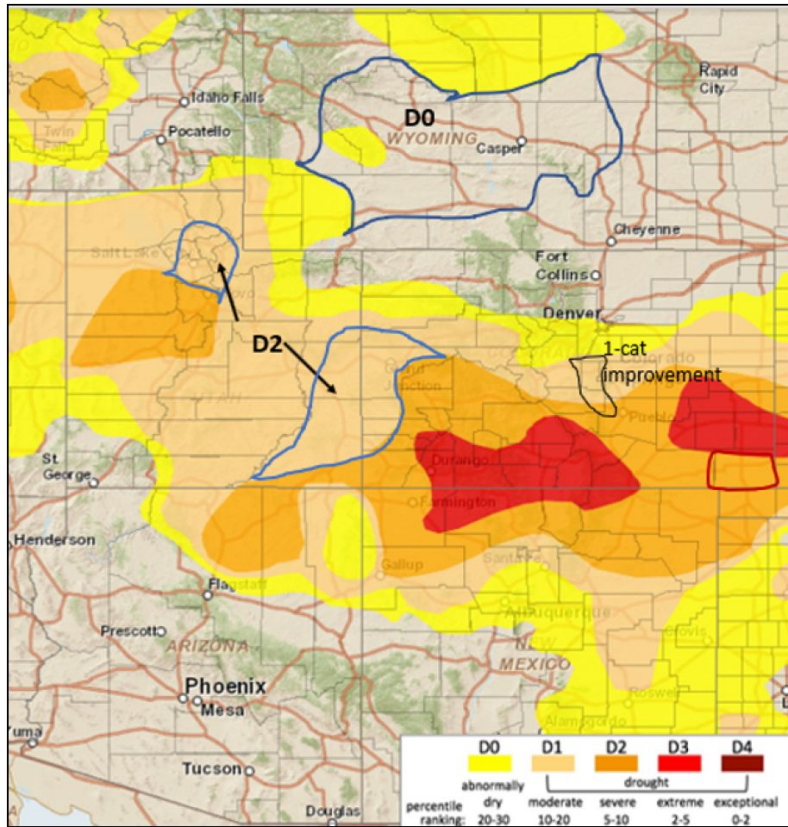
- Partnering with Colorado Climate Center (CCC) and other state and local agencies to assist with drought assessment, groundwater and agricultural management needs

**Approach:** Apply NASA's Land Information System (LIS) software to integrate data from multiple sources (GRACE, MODIS, NLDAS-2, PRISM, STATSGO, FAO, SRTM) in a configuration optimized for the western United States

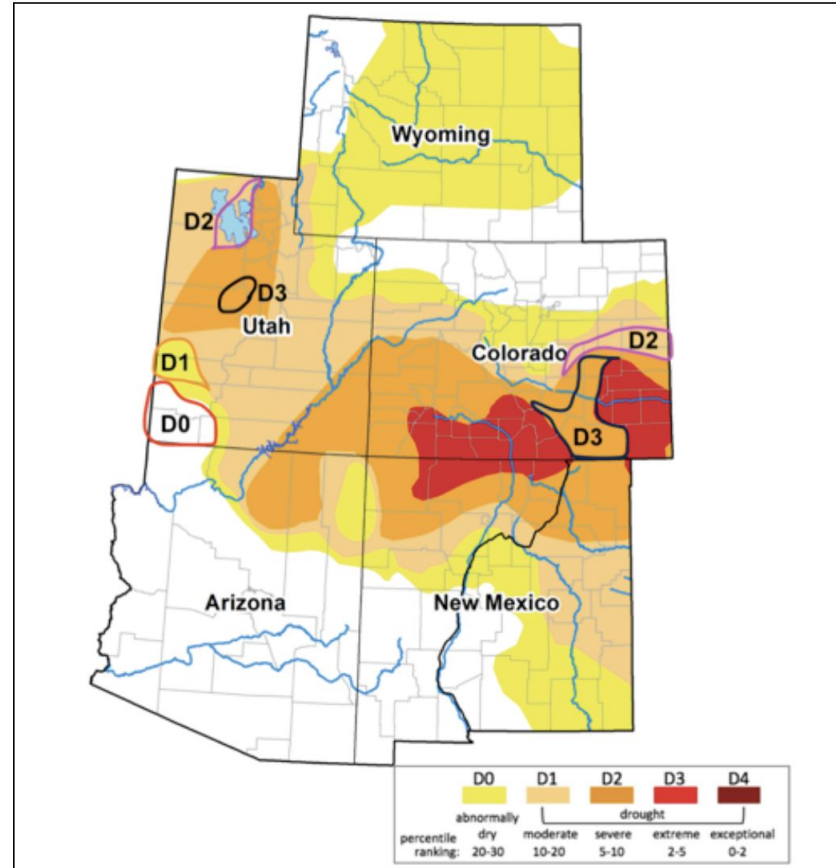
**Team:** Scientists from GSFC and CCC



# Motivation



June 2



June 9

## Recommendations:

**UCRB:** Widespread D2 expansion is recommended in western Colorado and eastern Utah along with D2 expansion around the Salt Lake City area. This expansion is driven mostly by poor SPEI numbers on multiple timescales out to 5 months. Low SPI and precipitation percentiles over the past 5 months back this up as well.

**Colorado:** Improvement is recommended in central Colorado through Teller, southeastern Park, eastern Fremont, northwestern Pueblo, and far western El Paso counties. This area received 1-2 inches of new precipitation over the last week. A 1-category improvement is being proposed, which will improve the D1 to D0 in Teller, Park, Fremont, and El Paso and improve D2 to D1 in Fremont and Pueblo.

**Baca County:** With D3 being recommended in the adjacent states, we are recommending D3 be included in this expansion and connect to the existing D3 in southeastern Colorado.

**Wyoming:** Widespread D0 is being recommended in Wyoming. The D0 expansion will connect the north central D0 with the southwest D0 and extending east to Albany County. Conditions in Wyoming have continued to dry out and it looks like it's time for degradations.

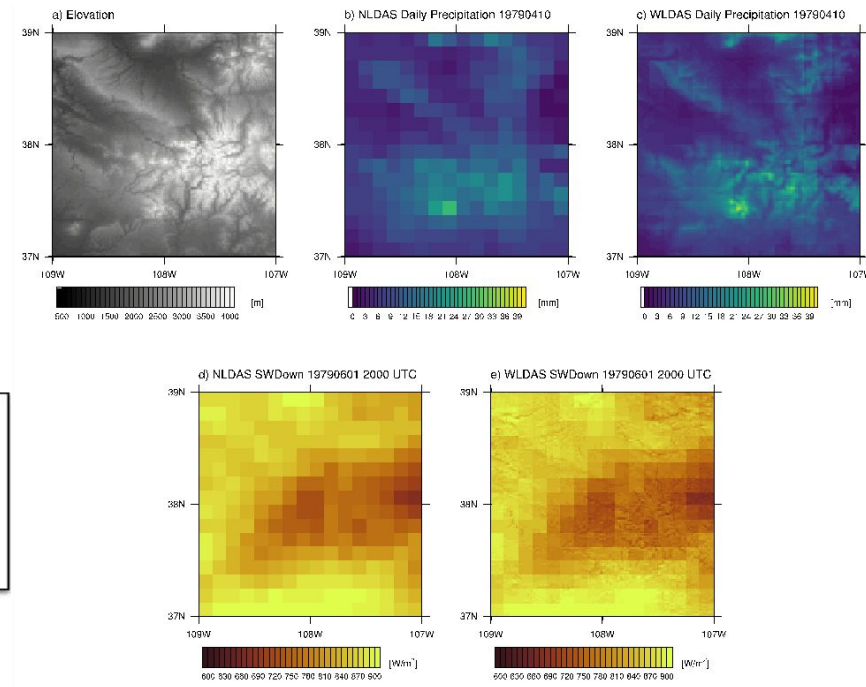
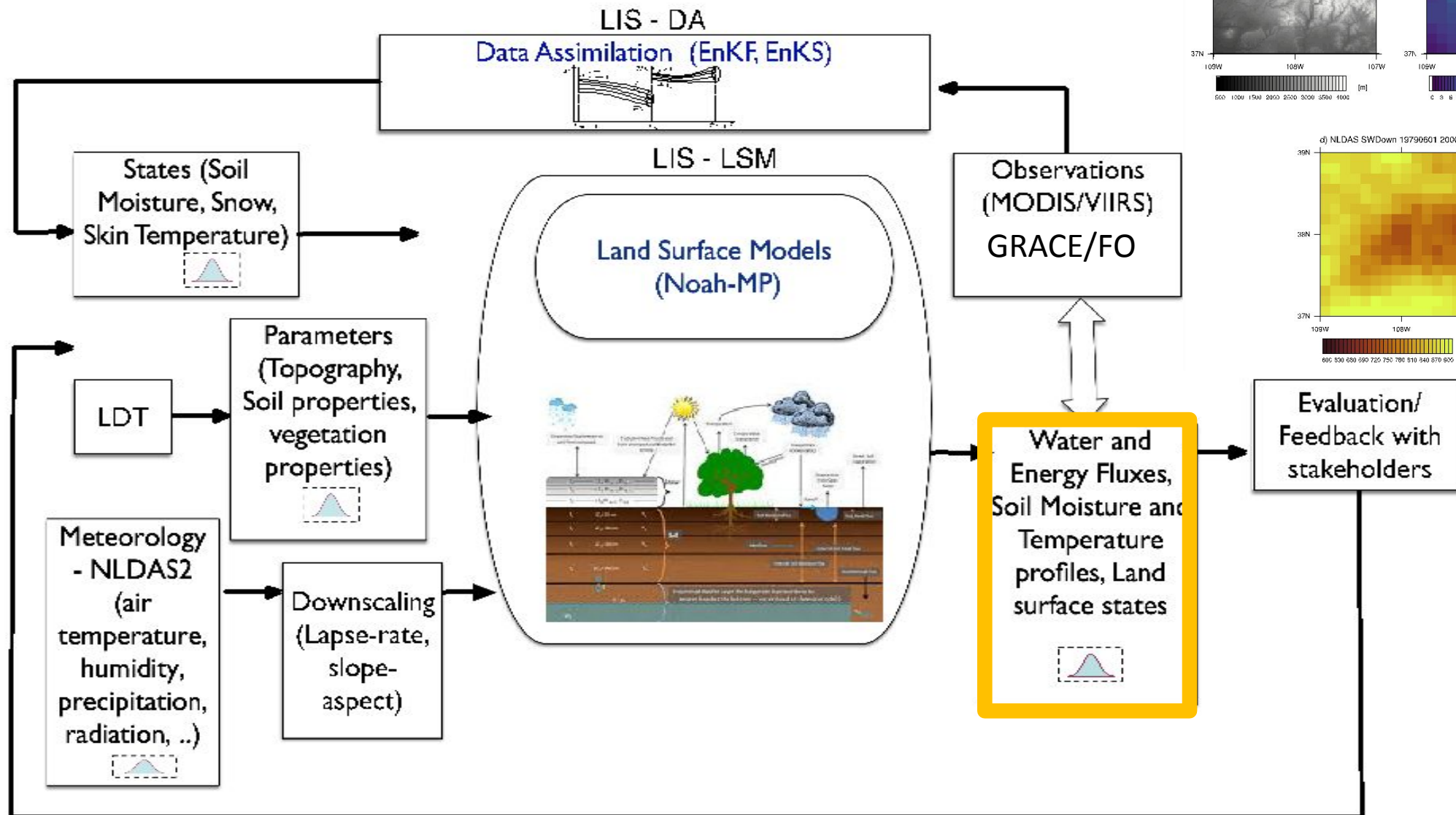


**Operational WLDAS products will appear here**

Colorado Climate Center drought assessments and recommended changes to the United States Drought Monitor.



# Product Generation Process

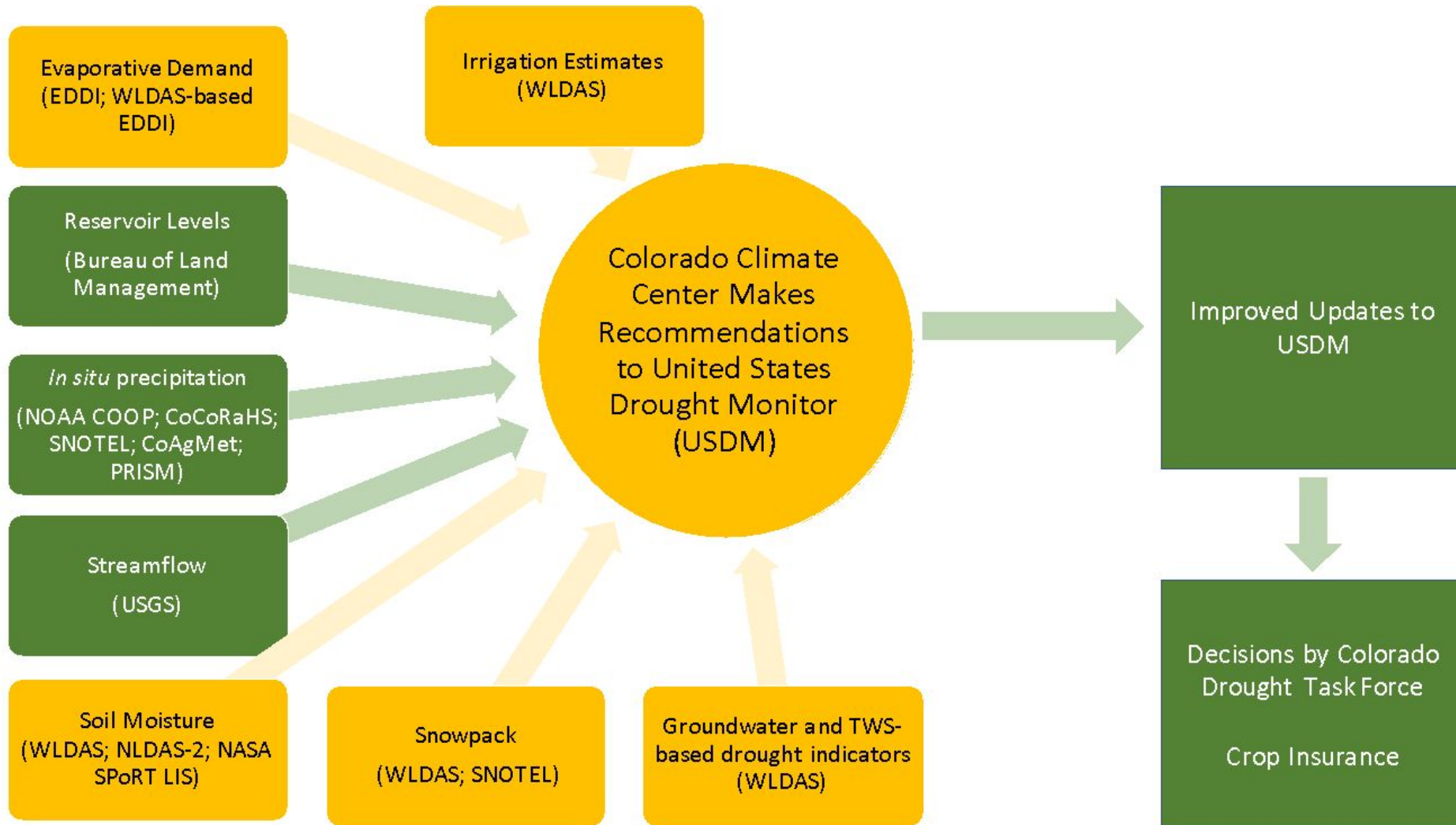


a) Elevation, b) NLDAS accumulated daily precipitation on 10 April 1979, c) Downscaled WLDAS accumulated daily precipitation on 10 April 1979, d) NLDAS downward shortwave radiation at 2000 UTC on 1 June 1979, and e) Downscaled WLDAS downward shortwave radiation for 1 June 1979

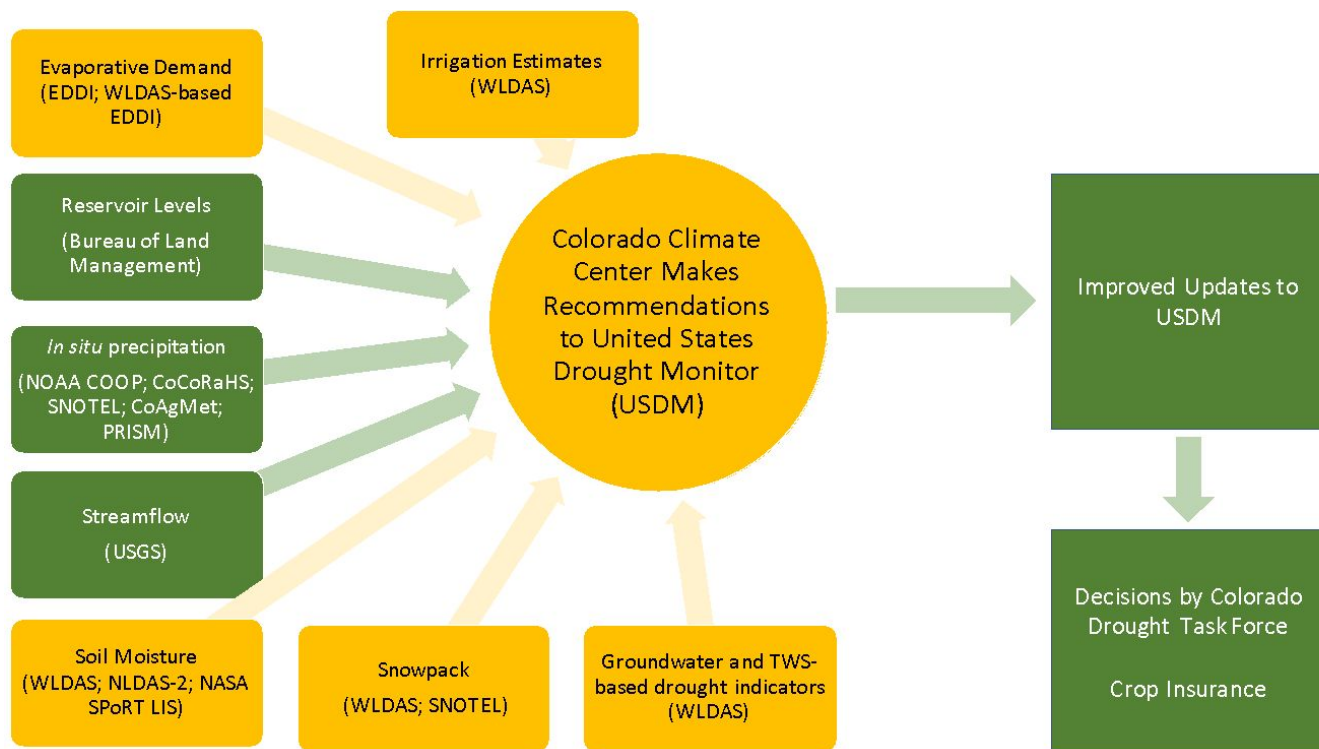
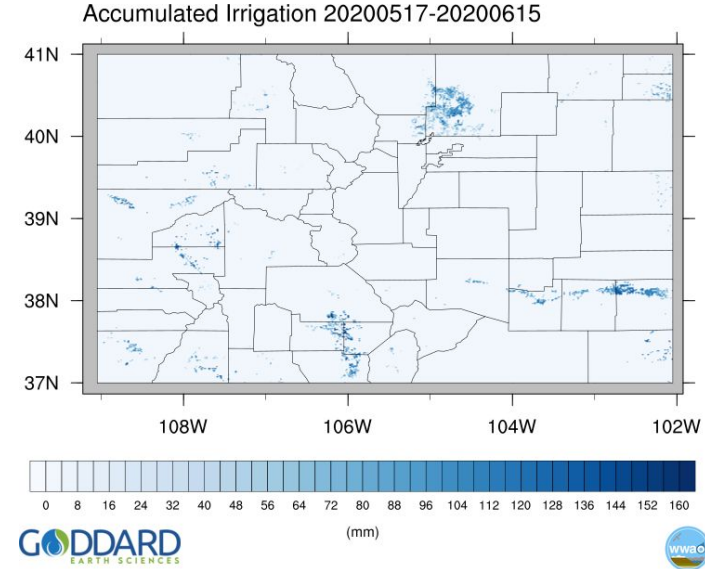
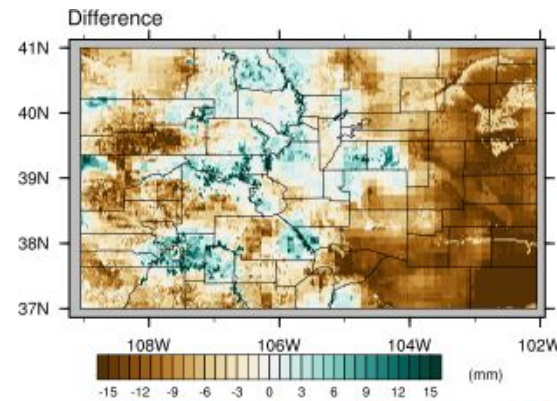
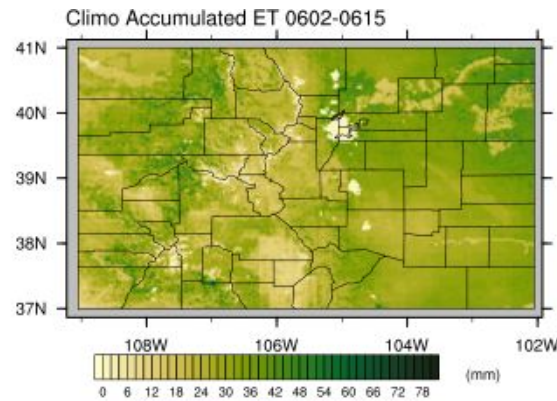
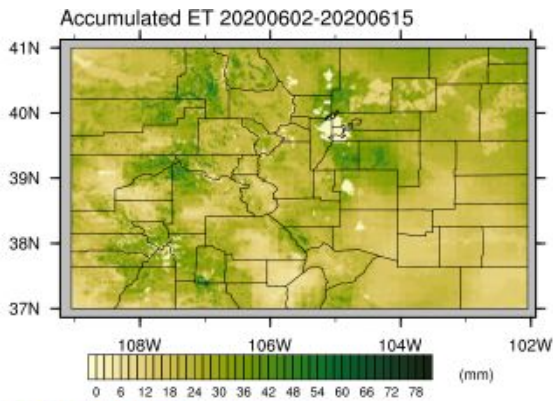
# Products

- Soil moisture, groundwater, and TWS drought indicators
- Soil moisture (0-10 cm, 10-40 cm, 40-100 cm, 100-200 cm below surface)
- Groundwater storage anomalies and recharge
- TWS anomalies
- Downscaled meteorological forcing (radiation, precipitation, 2-meter temperature and humidity)
- ET
- Running (weekly, 14-day, 30-day) ET and ET anomalies
- Surface and subsurface runoff
- Snow water equivalent (SWE)
- Simulated irrigation water use

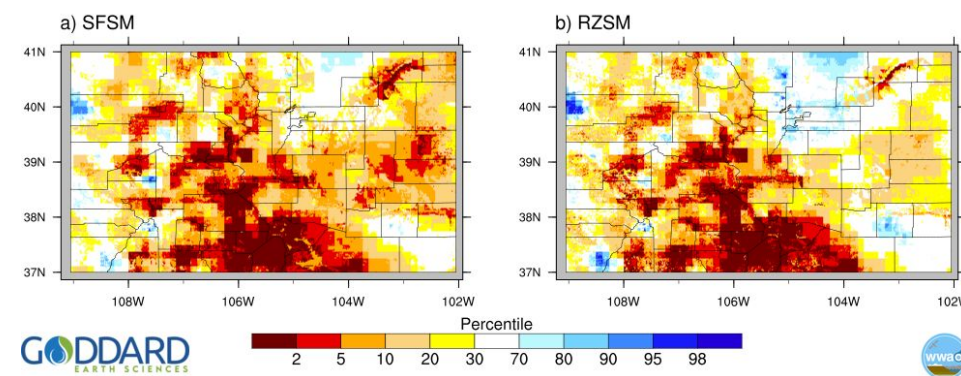
# New Workflow at CCC







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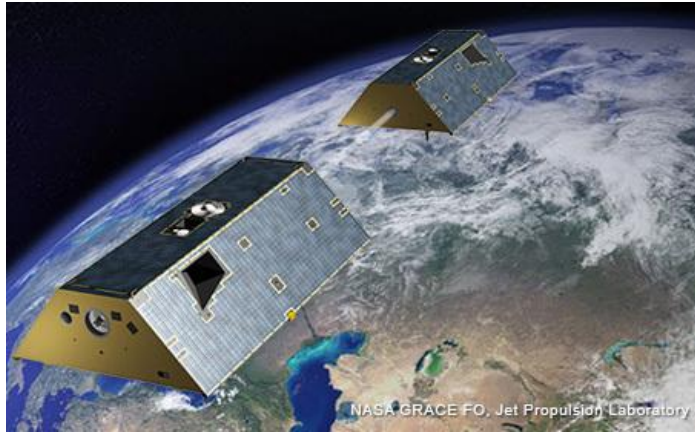


# WLDAS Suite

- Open Loop (OL)
  - Noah-MP 4.0.1 with NLDAS-2 downscaled forcing
- OL + Irrigation
  - Only differs from (OL) over irrigated pixels
  - Useful for estimating demand for irrigation based on soil moisture conditions (Ozdogan et al. 2010)
- LAI DA
  - Constrains dynamic vegetation parameterization using MODIS LAI
  - Indirectly captures effects of irrigation
  - MCD15A2H v6 LAI data discontinued February 10, 2023
- GRACE DA



# GRACE/GRACE FO data for drought monitoring capability developed at the GSFC/Hydrological Sciences Laboratory

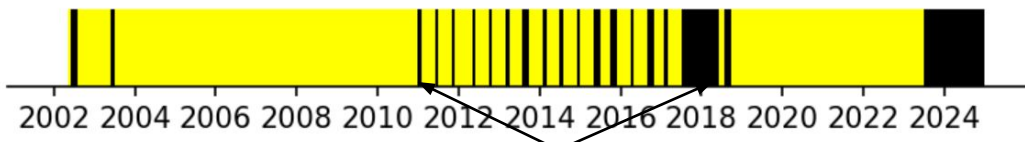
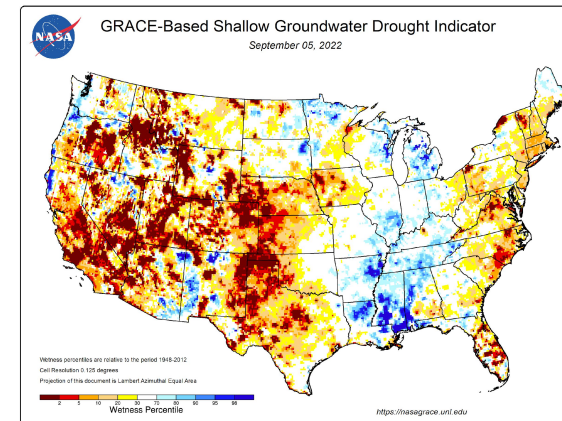
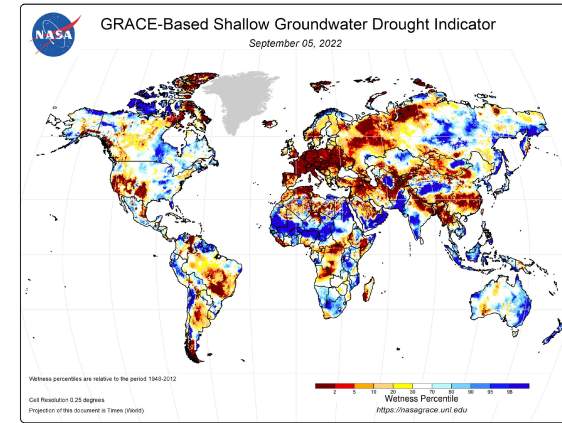


GRACE data assimilation (DA)



GRACE /GRACE-FO TWS:

- Gravity mapping
- Vertically integrated observations
- Monthly with ~3-month data latency
- ~150,000 km<sup>2</sup> spatial resolution



missing data

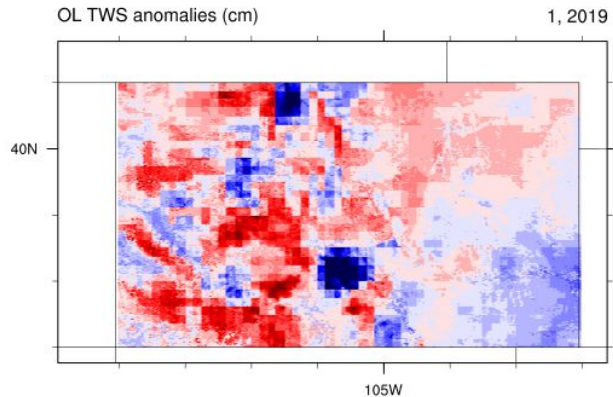
Maps available at <https://nasagrace.unl.edu/>

Li et al. 2019. "Global GRACE data assimilation for groundwater and drought monitoring: Advances and challenges." *Water Resour. Res.*, 55: 7564-7586 [10.1029/2018wr024618]

# GRACE data assimilation for high resolution data in Colorado

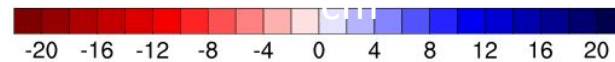
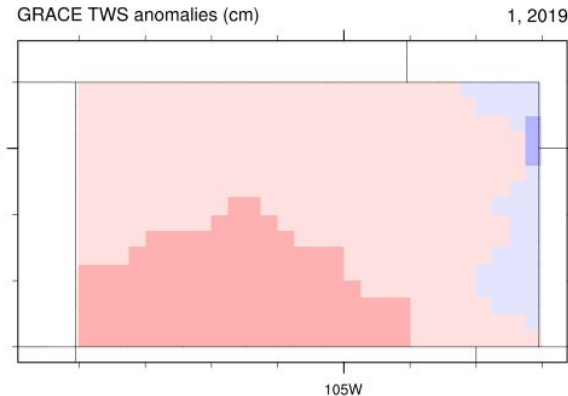
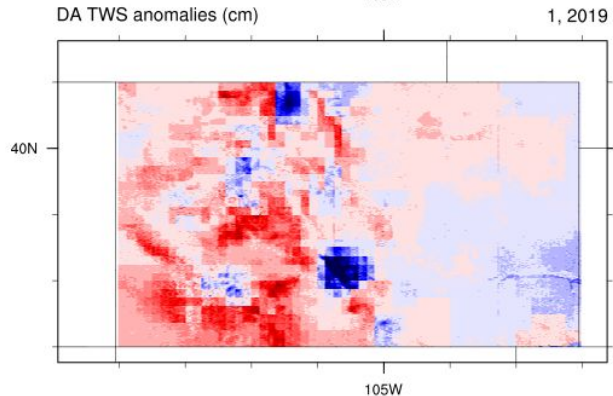
Monthly anomalies (relative to monthly mean)  
(2019-2021)

Open loop  
(1 km)



GRACE observations

Downscaled  
GRACE  
(1 km)



WLDAS/GRACE DA  
SPECS:

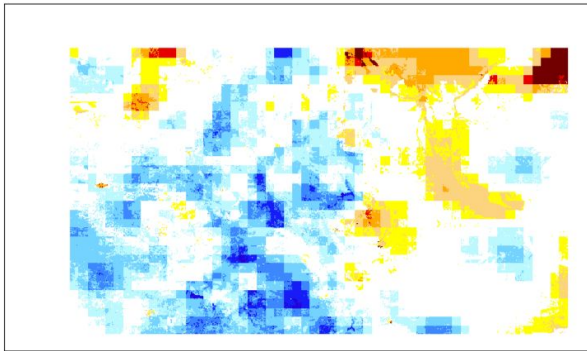
- Noah-MP (more advanced physics for snow)
- 1 km (to accommodate the complex terrain of Colorado)

Contact: [bailing.li@nasa.gov](mailto:bailing.li@nasa.gov)

# GRACE-based drought percentile maps at 1 km (August 2022 - September 2023)

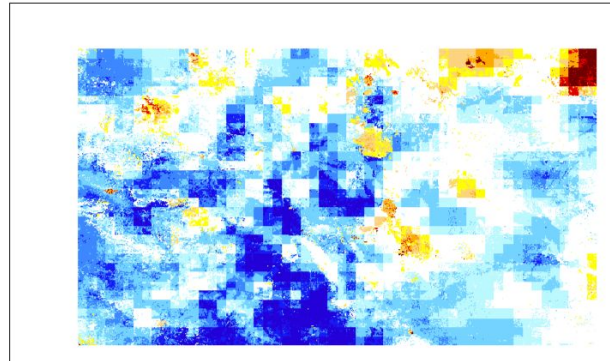
Surface soil moisture

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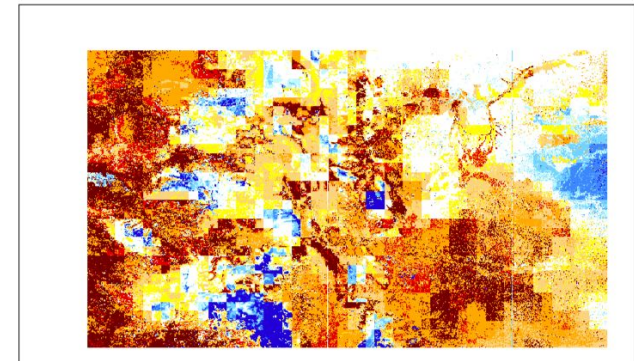
Root zone soil moisture

20220831



Groundwater storage

20220831



Limitation: Drought percentiles were derived based on short climatology (GRACE DA simulation)

Transitioned GRACE-based drought monitoring capability to CCC:

- Installation of LIS using a containerizing technique (Jim Geiger)
- Set up the LIS run environment in CCC's computer system
- Trained users to run GRACE data assimilation

Contact: [bailing.li@nasa.gov](mailto:bailing.li@nasa.gov)



# Partner Impact Statements

- Using the additional [drought monitoring] data provided by NASA to improve regional recommendations to the United States Drought Monitor, which is tied to the Livestock Forage Program disaster relief fund
- Additional data was also used in updates to the state's Water Availability Task Force. A subcommittee of this team is tasked with choosing whether or not to issue a drought disaster declaration for part, or all, of Colorado.
- Soil moisture maps derived from the WLDAS data were also used to support a disaster request made by the state of Colorado to FEMA for flooding caused by extreme rainfall in May-June 2023. The soil moisture information was used to illustrate that soils remained abnormally wet in between the two primary periods of extreme rainfall, likely exacerbating the flooding that occurred

# Data Delivery

- GES DISC

Erlingis, J., Li, B. and Rodell, M., NASA/GSFC/HSL (2024), WLDAS Noah-MP 3.6 Land Surface Model L4 Daily 0.01 degree x 0.01 degree Version D1.0, Greenbelt, Maryland, USA, Goddard Earth Sciences Data and Information Services Center (GES DISC), [10.5067/ABBHPUIGJH5M](https://doi.org/10.5067/ABBHPUIGJH5M)

- CCC dashboard:

<https://climate.colostate.edu/drought/#soil>

- On NCCS Discover supercomputer Centralized Storage System:

<https://www.nccs.nasa.gov/services/data-collections/css-collections>

- NASA Center for Climate Simulation (NCCS) data portal:

<https://portal.nccs.nasa.gov/datashare/WLDAS/>

- Source code is publicly available to the scientific community on Github:

<https://github.com/NASA-LIS/LISF>

Western Land Data Assimilation System  
WLDAS Noah-MP 3.6 Land Surface Model L4 Daily 0.01 degree x 0.01 degree Version D1.0 (WLDAS\_NOAHMP001\_DA1)

The Western Land Data Assimilation System (WLDAS), developed at Goddard Space Flight Center (GSFC) and funded by the NASA Western Water Applications Office, provides water managers and stakeholders in the western United States with a long-term record of near-surface hydrology for use in drought assessment and water resources planning. WLDAS leverages advanced capabilities in land surface modeling and data assimilation to furnish a system that is customized for stakeholders' needs in the region. WLDAS uses NASA's Land Information System (LIS) to configure and drive the Noah Multiparameterization (Noah-MP) Land Surface Model (LSM) version 3.6 to simulate land surface states and fluxes. WLDAS uses meteorological observables from the North American Land Data Assimilation System (NLDAS-2) including precipitation, incoming shortwave and longwave radiation, near surface air temperature, humidity, wind speed, and surface pressure along with parameters such as vegetation class, soil texture, an ...more

Cloud Enabled

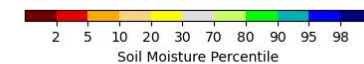
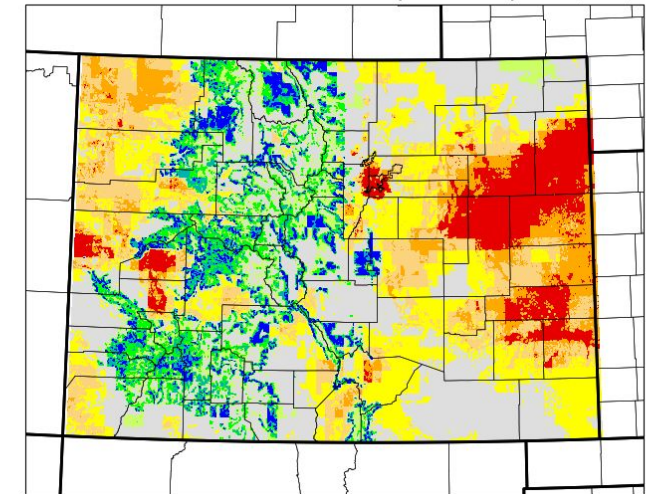
View Full-size Image

Data Access

- Online Archive
- Earthdata Search
- OPENDAP

Subset / Get Data

Soil Moisture Percentiles (0-10cm) 04/19/2024



<https://climate.colostate.edu/drought/#soil>

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# Project Publications

- Li, B., M. Rodell, C. Peters-Lidard, J. Erlingis, S. Kumar, and D. Mocko, Groundwater Recharge Estimated by Land Surface Models: An Evaluation in the Conterminous United States. *J. Hydrometeorol.*, **22**, 499–522, doi:10.1175/JHM-D-20-0130.1.
- Erlingis, J., M. Rodell, C.D. Peters-Lidard, B. Li, S.V. Kumar, D. Mocko, 2021: A High-Resolution Land Data Assimilation System Optimized for the Western United States, *Journal of the American Water Resources Association*, 1-19, doi: [10.1111/1752-1688.12910](https://doi.org/10.1111/1752-1688.12910).
- Erlingis, J., Li, B. and Rodell, M., NASA/GSFC/HSL (2023), WLDAS Noah-MP 3.6 Land Surface Model L4 Daily 0.01 degree x 0.01 degree Version D1.0, Greenbelt, Maryland, USA, Goddard Earth Sciences Data and Information Services Center (GES DISC), [10.5067/ABBHPUIGJH5M](https://doi.org/10.5067/ABBHPUIGJH5M)



# Additional Slides

# LSM Input and Output Fields

## Assimilated Data Fields:

- snow cover
- snow depth or water equivalent
- soil moisture
- terrestrial water storage anomaly
- leaf area index
- irrigation intensity
- surface temperature

## Summary of Output Fields:

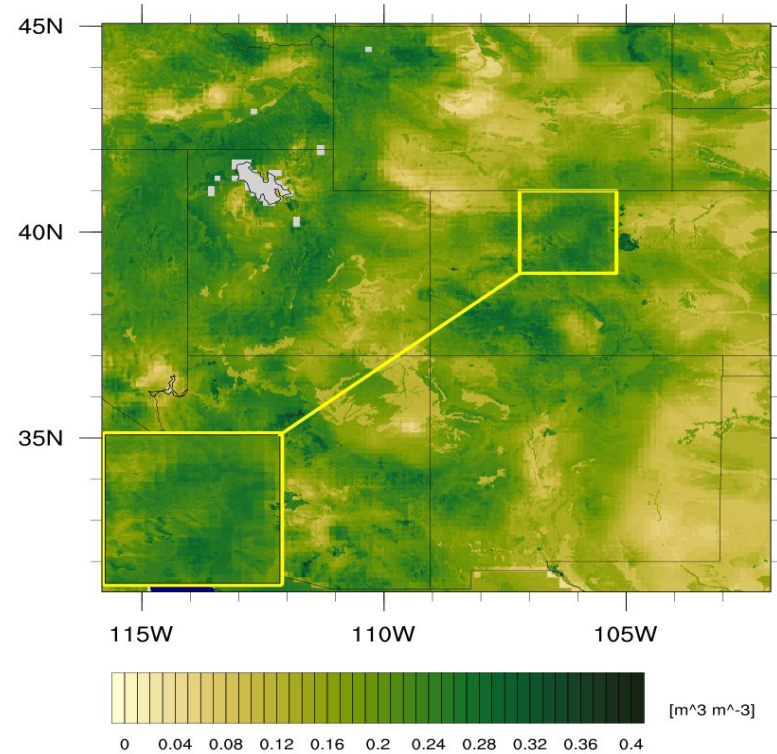
- soil moisture in each layer
- snow water equivalent
- groundwater storage
- soil temperature in each layer
- surface and subsurface runoff
- evaporation
- transpiration
- latent, sensible, and ground heat fluxes
- snowmelt
- snowfall and rainfall
- net shortwave and longwave radiation

## Input Parameters:

- vegetation class
- vegetation greenness/LAI
- soil type
- elevation

## Required Forcing Fields:

- total precipitation
- convective precipitation*
- downward shortwave radiation
- downward longwave radiation
- near surface air temperature
- near surface specific humidity
- near surface wind speed ( $U$  &  $V$ )
- surface pressure



Simulated 0-10 cm soil moisture  
on 8 September 2013.

# LAI Data Assimilation Improves ET Estimation

- Assimilating 500m MODIS Leaf Area Index (LAI; MCD15A2H v6) 8-day composites to constrain dynamic vegetation from mid 2002-present
- Improves ET estimation (warm colors) over open loop run when compared with UW, ALEXI, GLEAM, and FLUXNET products

Kling-Gupta Efficiency

