

# The Evaporative Demand Drought Index (EDDI): an emerging drought-monitoring & early warning tool

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*DWD, LfULG Saxony, JRC and NOAA Collaboration Workshop – Dresden-Pillnitz, Germany  
November 16-18, 2016*



Cooperative Institute for Research in Environmental Sciences  
UNIVERSITY OF COLORADO BOULDER and NOAA

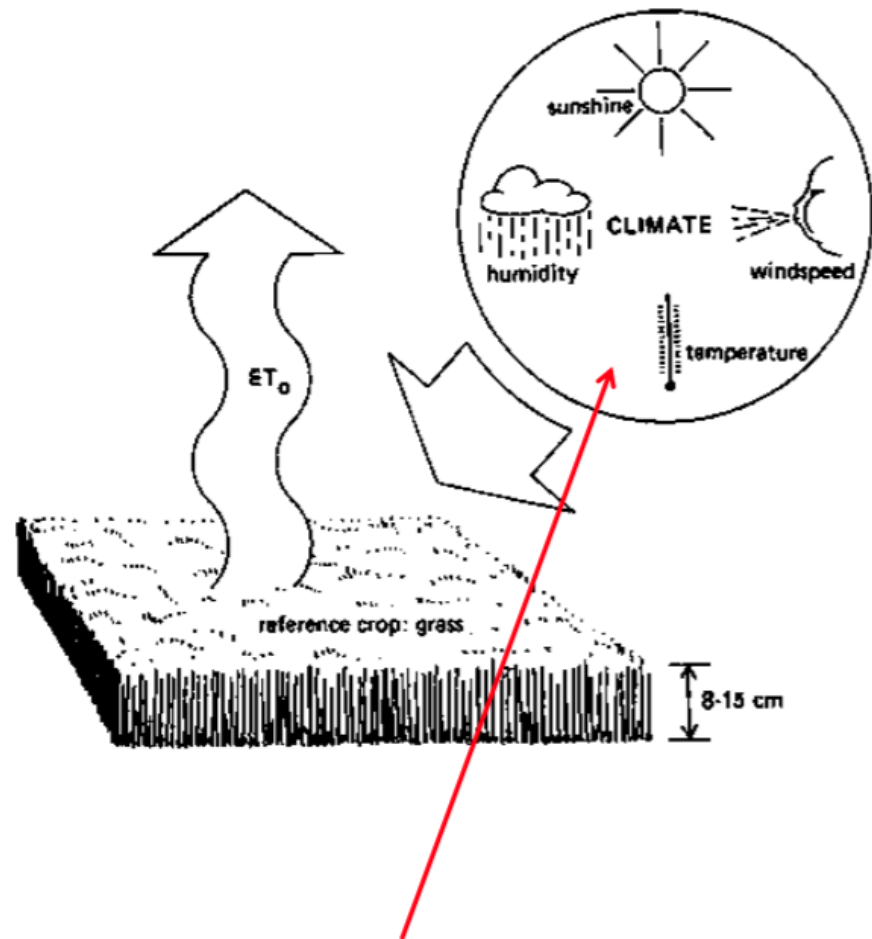


# What is Evaporative Demand ( $E_0$ )?

$ET$  = actual evapotranspiration

$E_0$  = evaporative demand

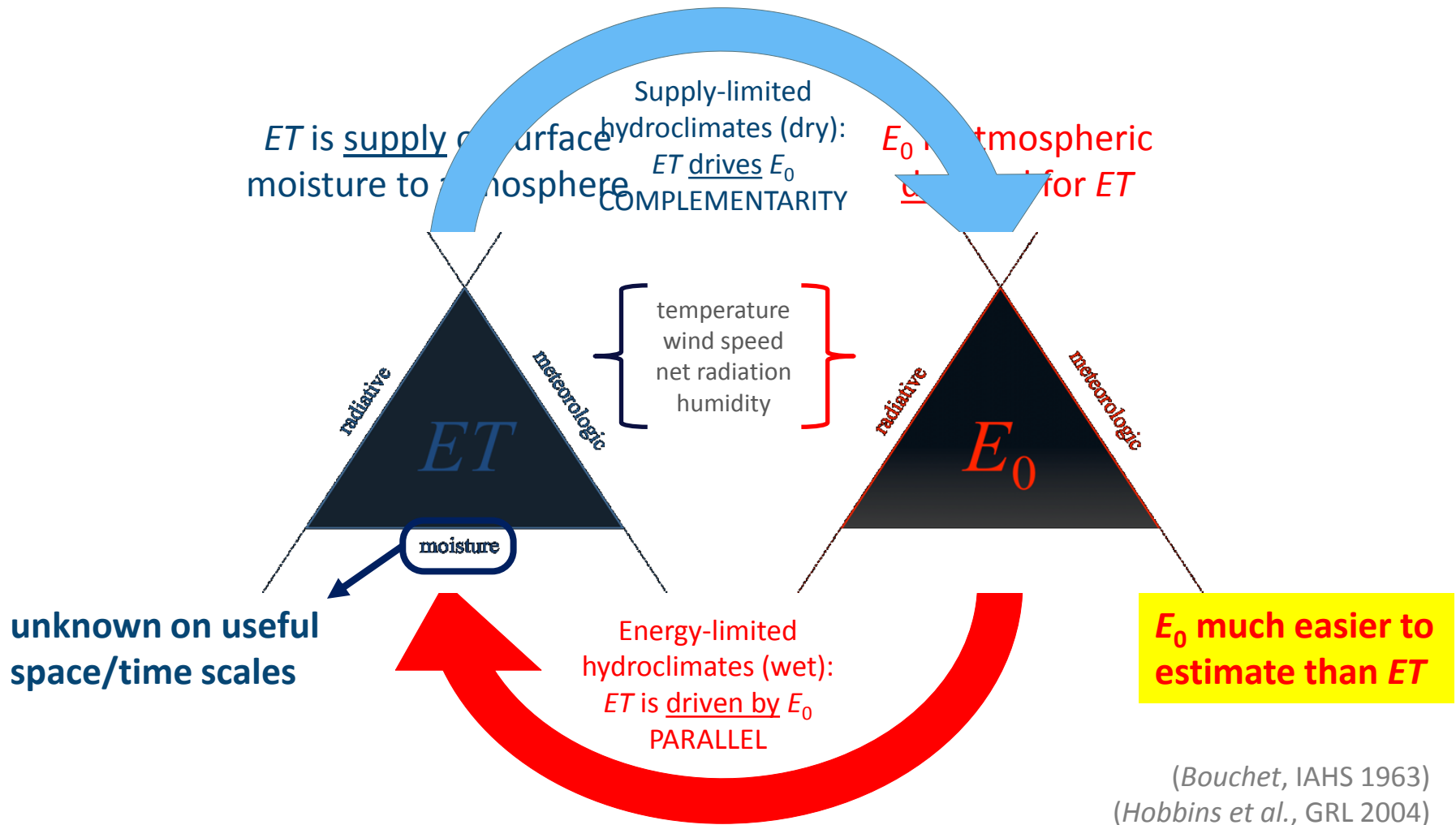
- “Thirst of the atmosphere”
- $ET$  occurring given an unlimited moisture supply
  - Reference  $ET$
  - Potential  $ET$  (“ $PET$ ”)
  - Pan evaporation
- There are good estimates and bad estimates:
  - physically based
  - temperature-based



**Physically-based  $E_0$  contains valuable information related to drought dynamics**

# $E_0$ / $ET$ constraints and interactions

$ET$  = actual evapotranspiration  
 $E_0$  = evaporative demand



# Estimating $E_0$ from reference $ET$

Penman-Monteith Reference  $ET$  (FAO-56):

$$ET_0 = \underbrace{\frac{0.408\Delta}{\Delta + \gamma(1 + C_d U_2)} (R_n - G) \frac{86400}{10^6}}_{\text{Radiative forcing (sunshine, } T\text{)}} + \underbrace{\frac{\gamma \frac{C_n}{T}}{\Delta + \gamma(1 + C_d U_2)} U_2 \frac{(e_{sat} - e_a)}{10^3}}_{\text{Advection forcing (wind, humidity, } T\text{)}}$$

“Reference” crop specified:

- 0.12-m grass or 0.50-m alfalfa
- well-watered, actively growing,
- completely shading the ground,
- albedo of 0.23.

Drivers from NLDAS-2:

- temperature at 2 m
- specific humidity at surface
- downward SW at surface
- wind speed at 10 m
- daily, Jan 1, 1979 – present
- ~12-km, CONUS-wide

$\lambda$  = latent heat of vaporization

$R_n$  = net radiation (SW + LW) at crop surface

$G$  = ground heat flux

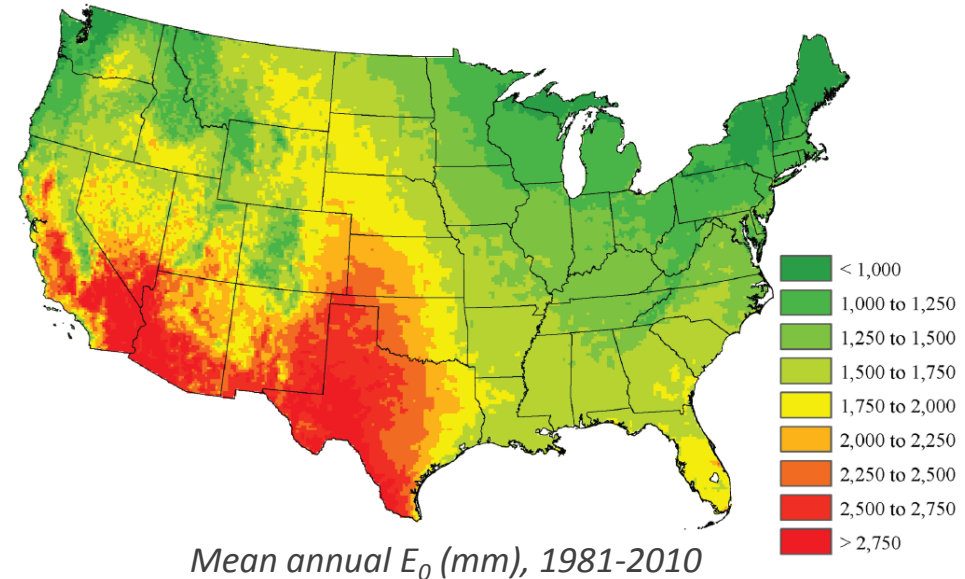
$U_2$  = 2-m wind speed

$e_{sat} / e_a$  = saturated / actual vapor pressure

$\Delta = de_{sat}/dT$  at air temperature  $T$

$\gamma$  = psychrometric constant

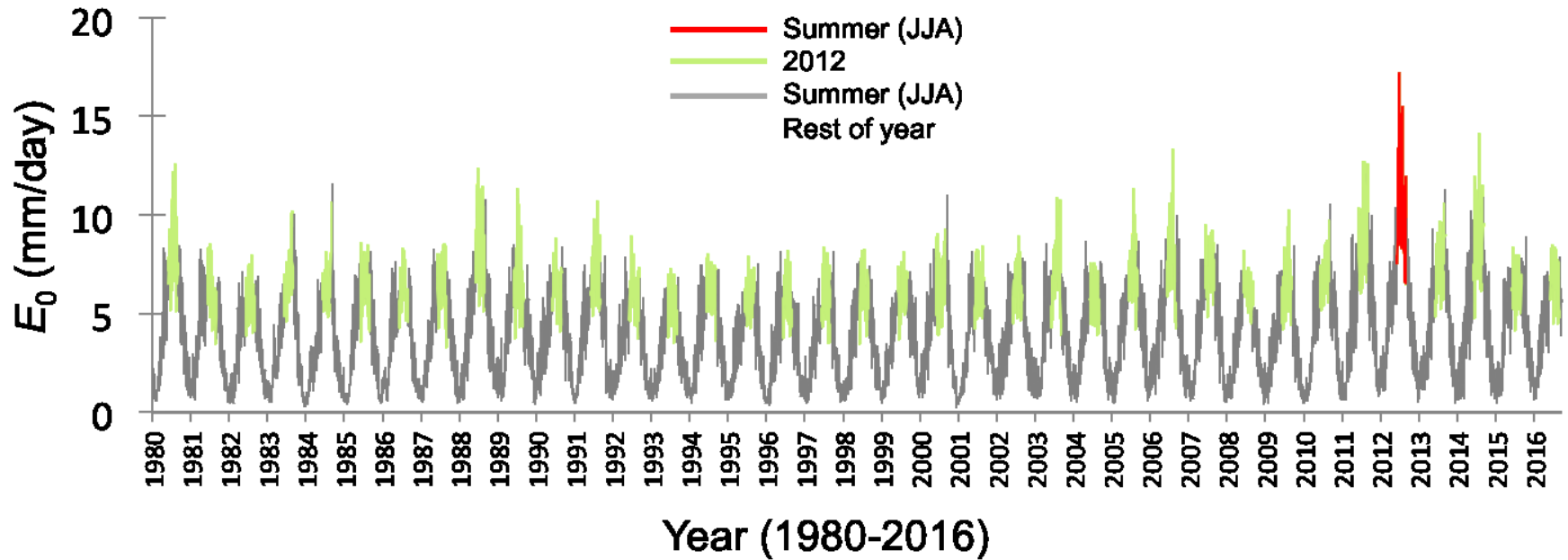
$C_n, C_d$  = constants for crop type and time-step



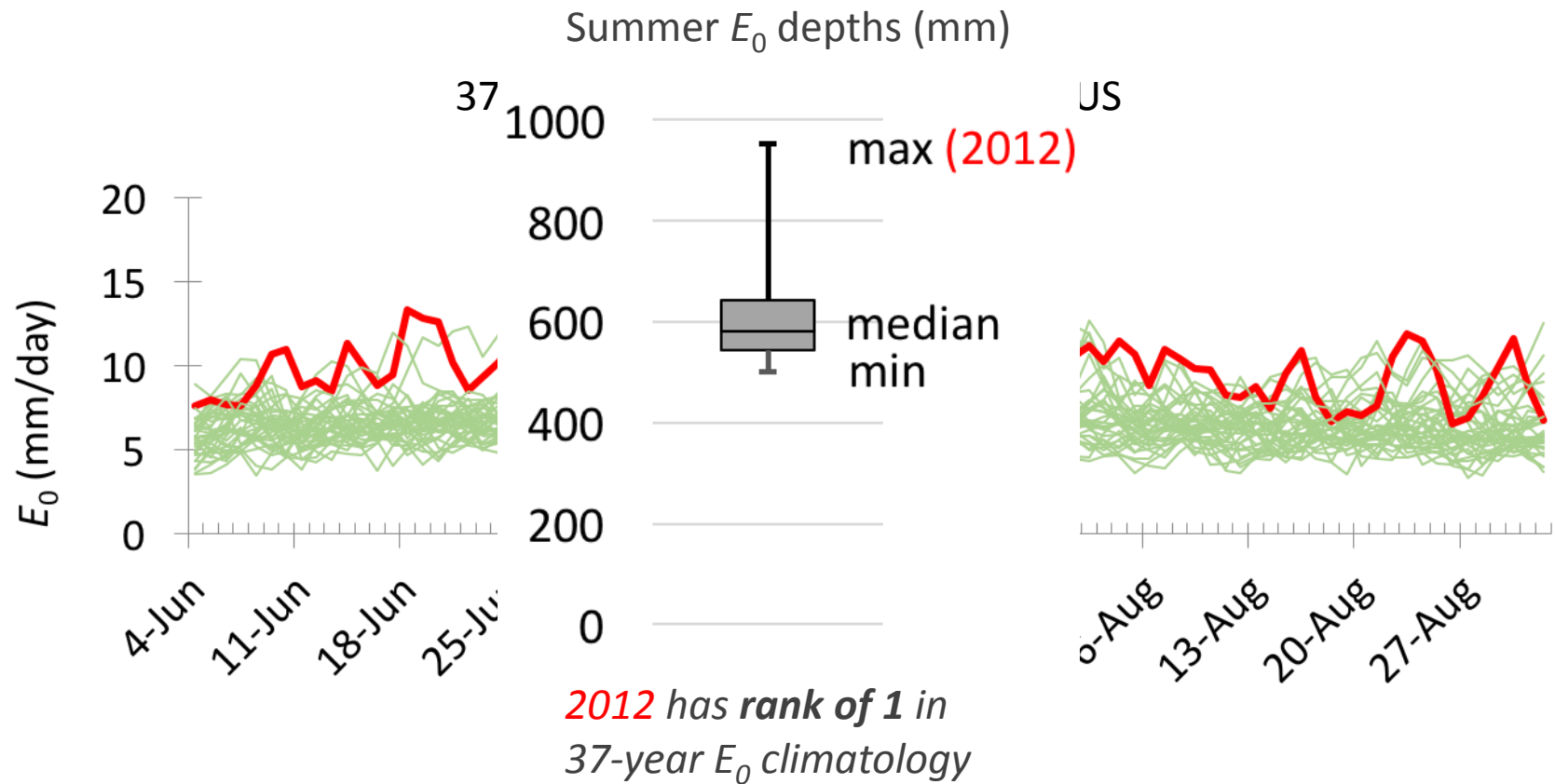


# Calculating EDDI

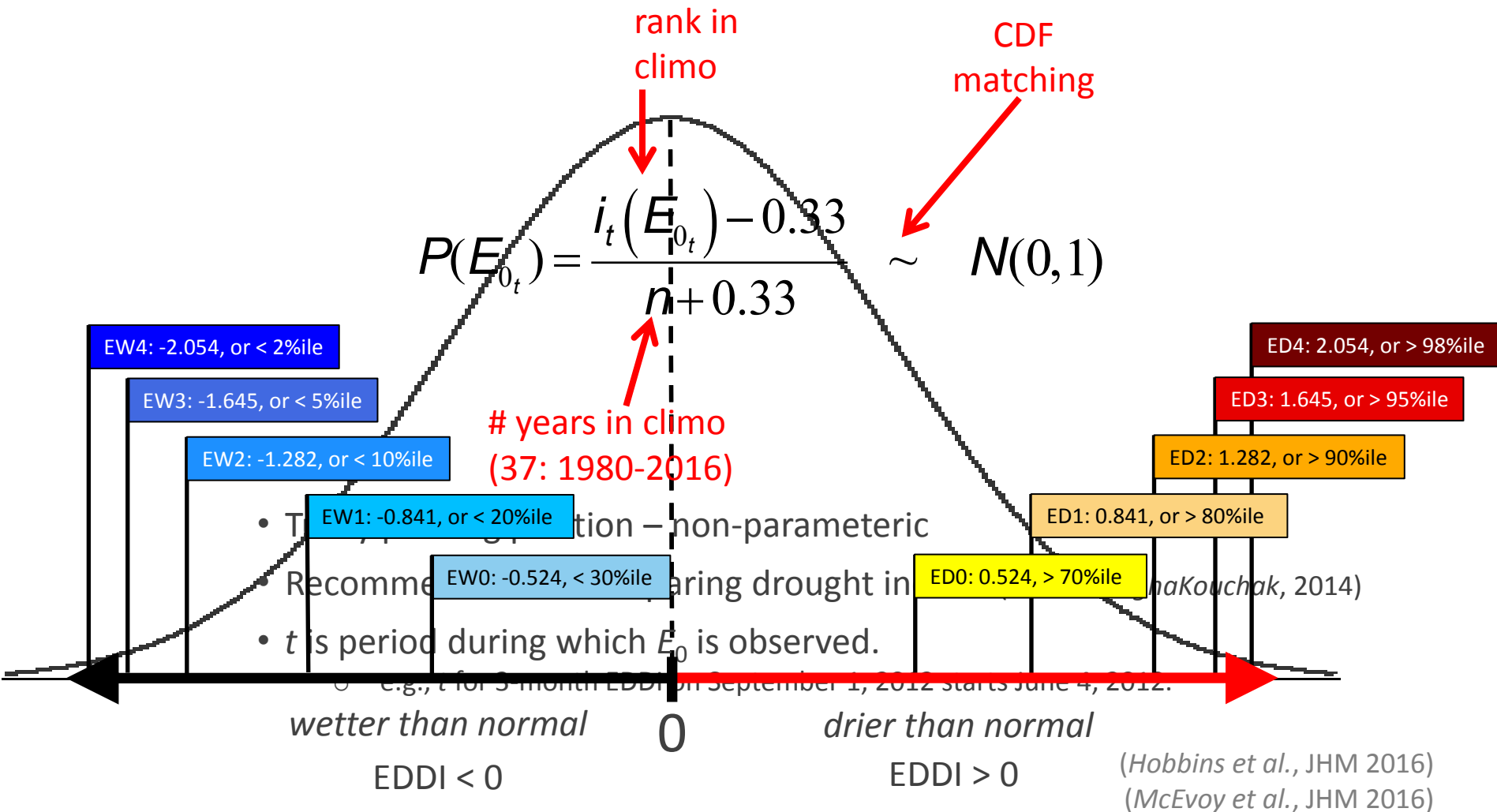
$E_0$  (reference  $ET$ ) – Midwest US



# Calculating EDDI

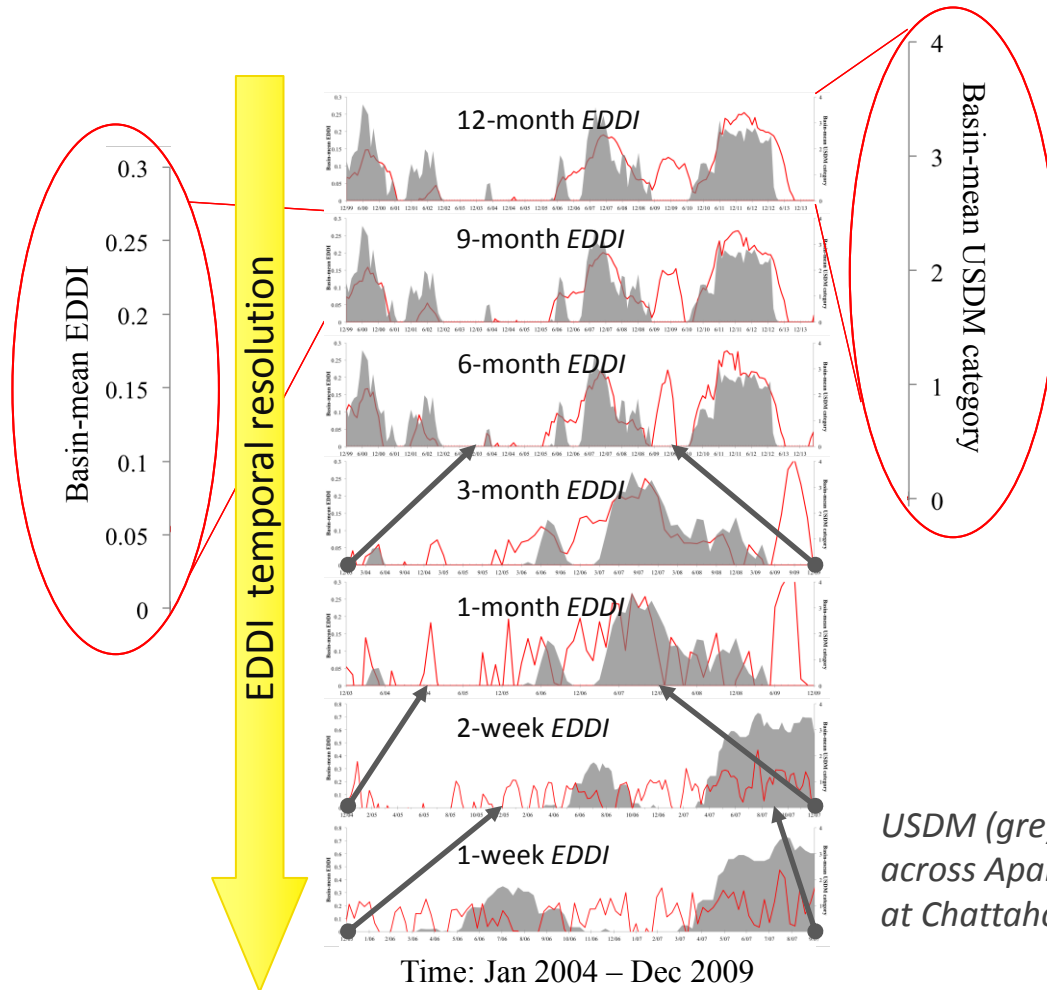


# Calculating EDDI



# Multi-scalar drought estimator

USDM = United States Drought Monitor



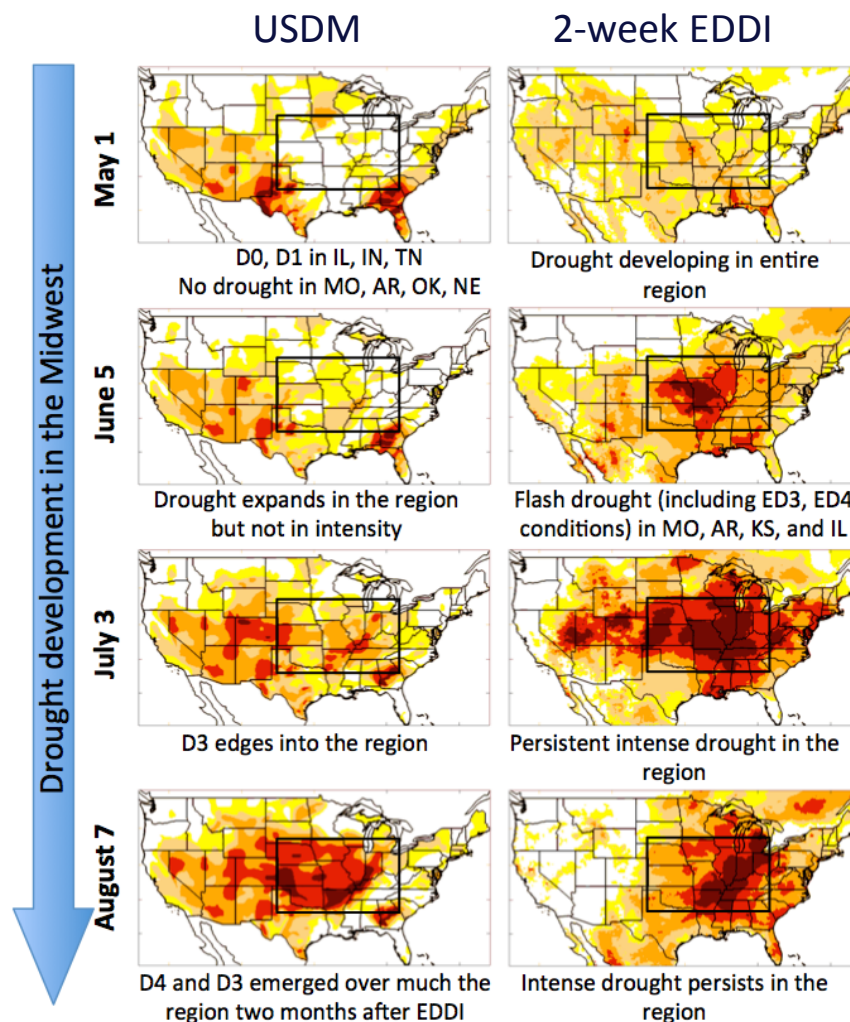
Signals of different drying dynamics are evident at different time-scales

*USDM (grey) and EDDI (red)  
across Apalachicola River basin  
at Chattahoochee, FL.*

# Leading indication of drought

2-week EDDI captures  
severe drought conditions  
~2 months before USDM

*"Flash drought" in the  
US Midwest, 2012*



# Monitoring across sectors



AGRICULTURAL  
DROUGHT

- soil moisture
- grazing health
- ET

HYDROLOGIC  
DROUGHT

- streamflow
- snowfall



FIRE-RISK  
MONITORING

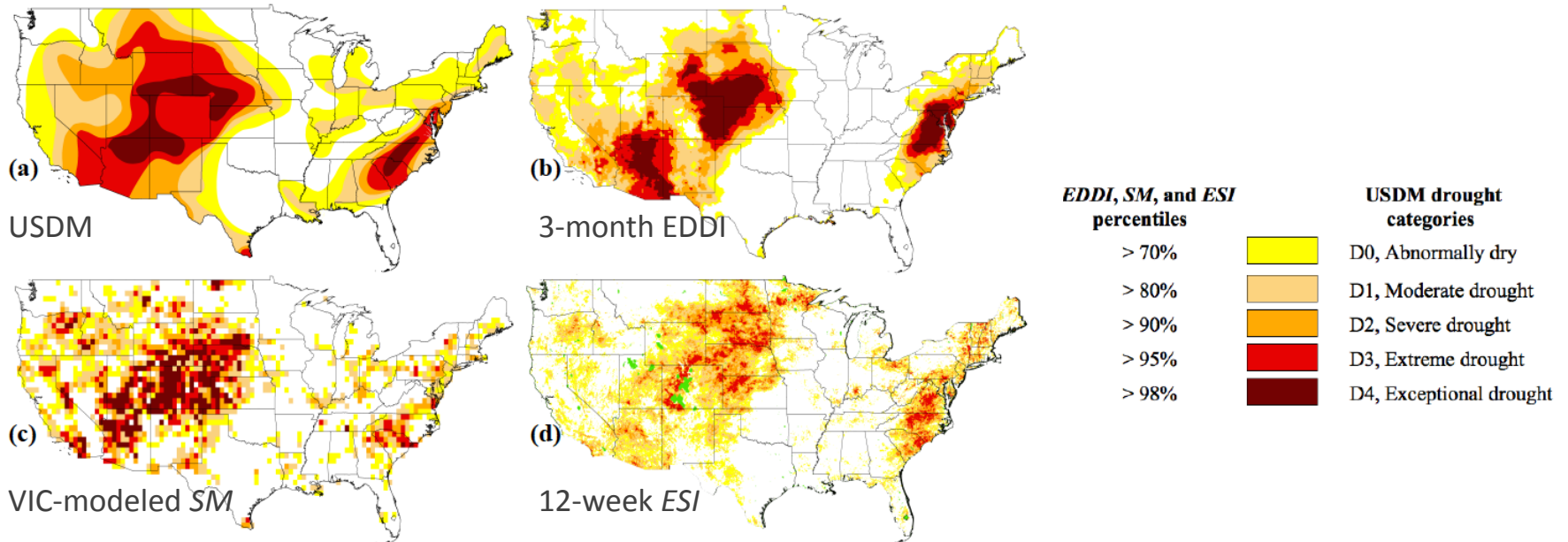
- weather
- fuel loads



# Agricultural drought monitoring

VIC = Variable Infiltration Capacity model

ESI = Evaporative Stress Index



*Agricultural drought across CONUS, July 31, 2002*

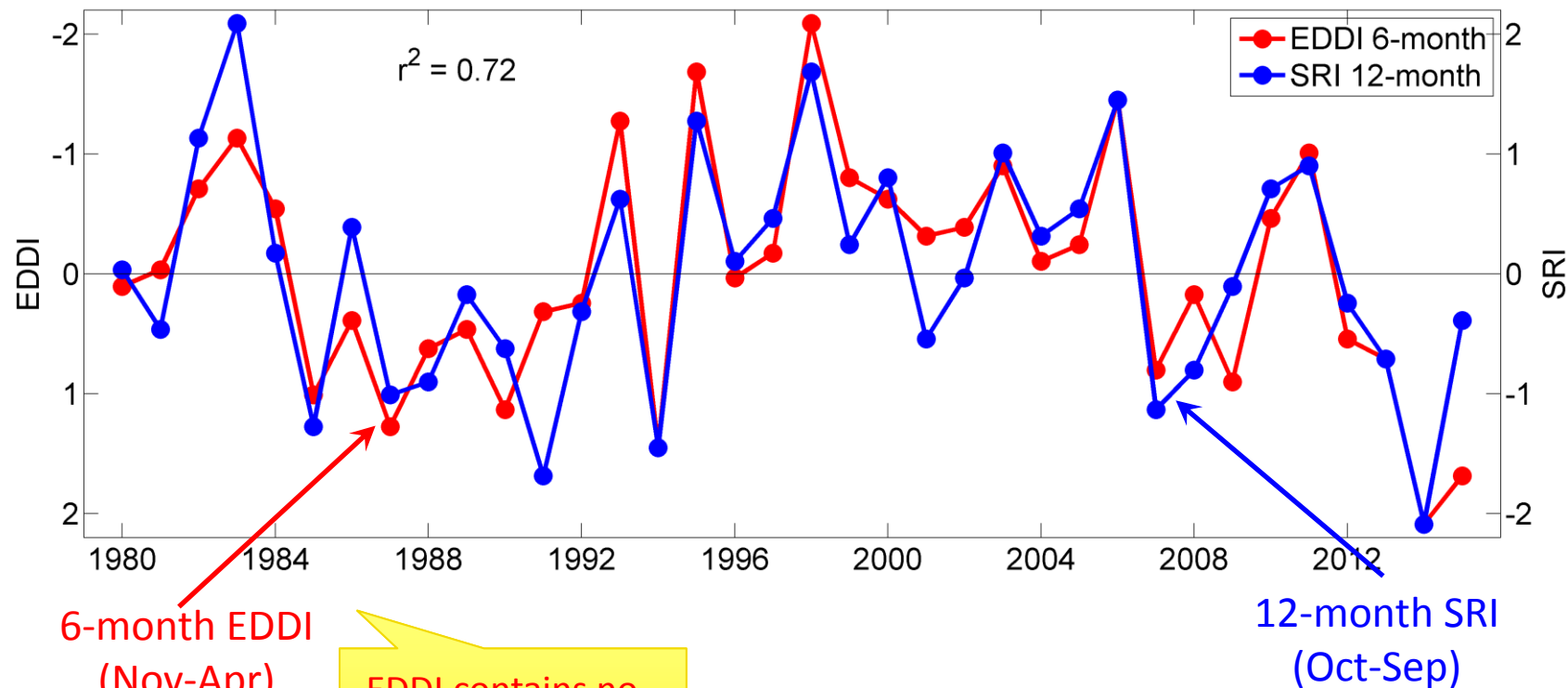
*(Hobbins et al., JHM 2016)*

# Hydrological drought prediction

SRI = Standardized Runoff Index

*Can EDDI help predict late-summer (low-flow) streamflow?*

Sacramento River Basin EDDI and SRI



(EDDI - McEvoy et al., JHM 2016)  
(SRI - Shukla and Wood, GRL 2008)

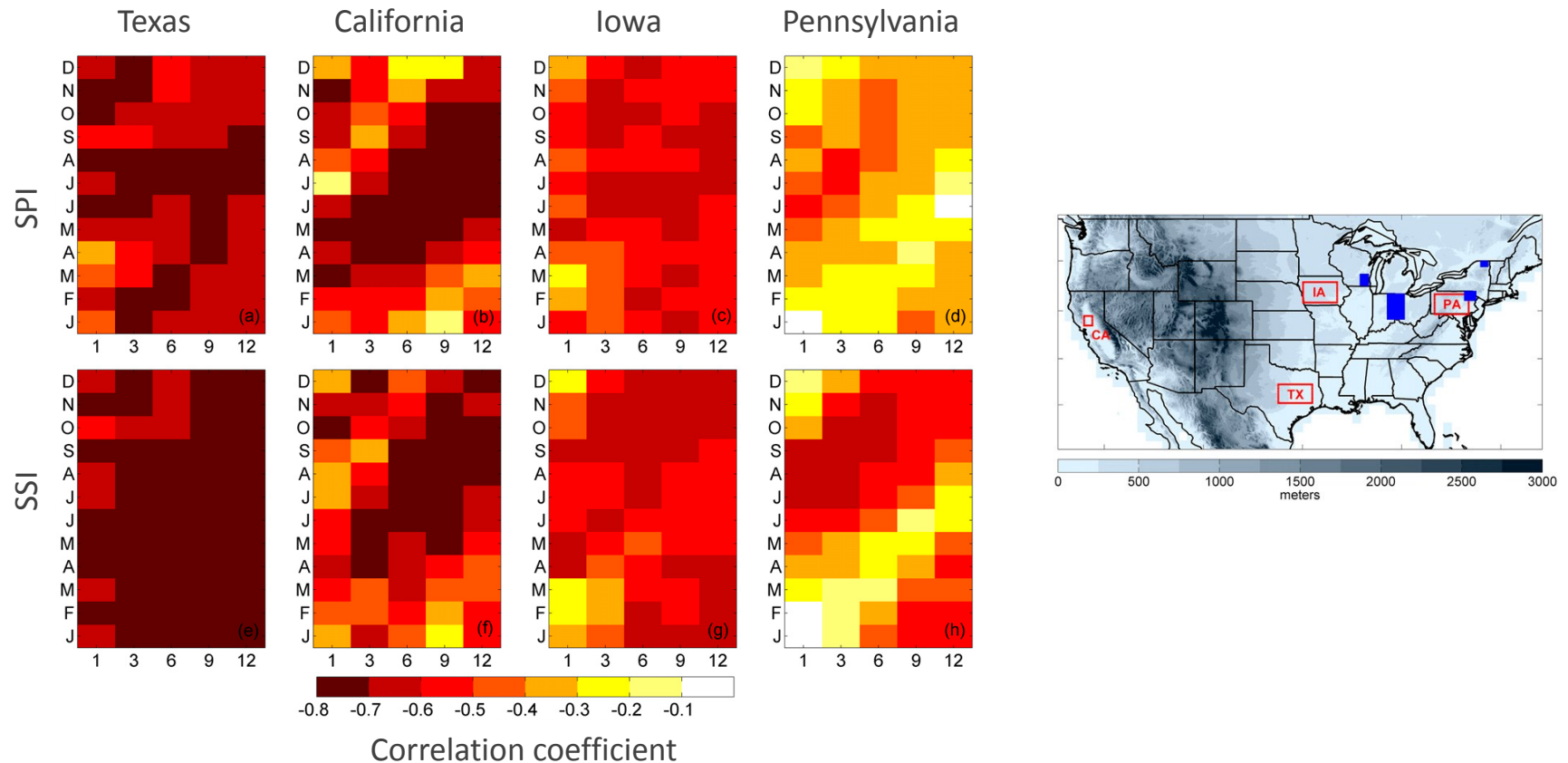


# Comparison to other drought metrics

## Across timescales and hydroclimates

SPI = Standardized Precipitation Index

SSI = Standardized Soil Moisture Index

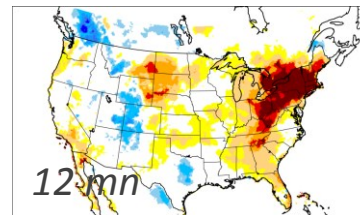
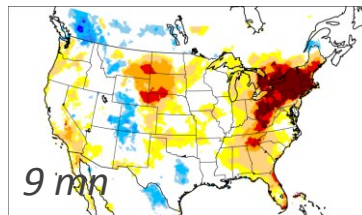
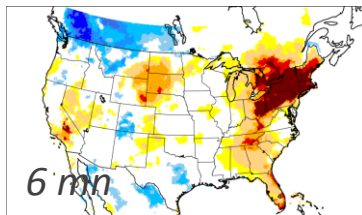
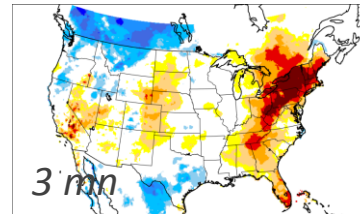
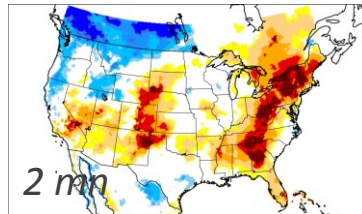
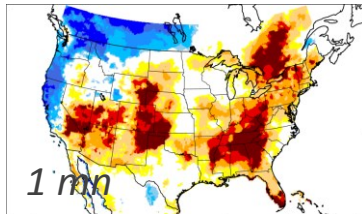
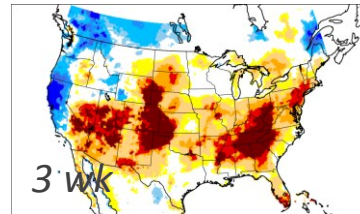
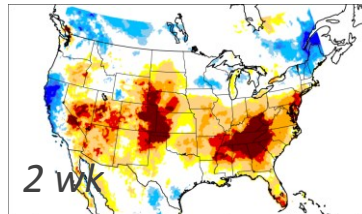
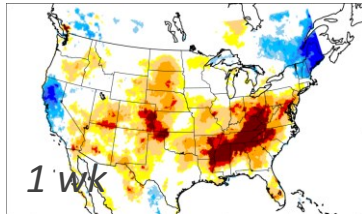


(McEvoy *et al.*, JHM 2016)

# EDDI at various timescales

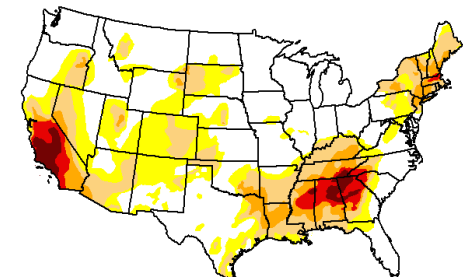
EDDI

Nov 4 2016

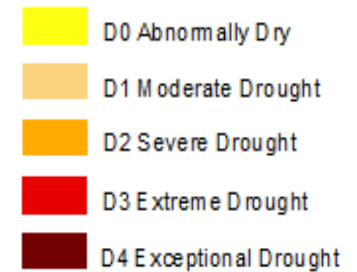


US Drought Monitor

Nov 8 2016

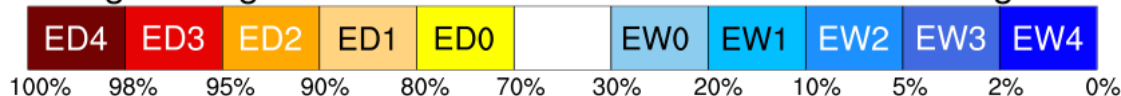


Intensity:



Drought categories

Wetness categories

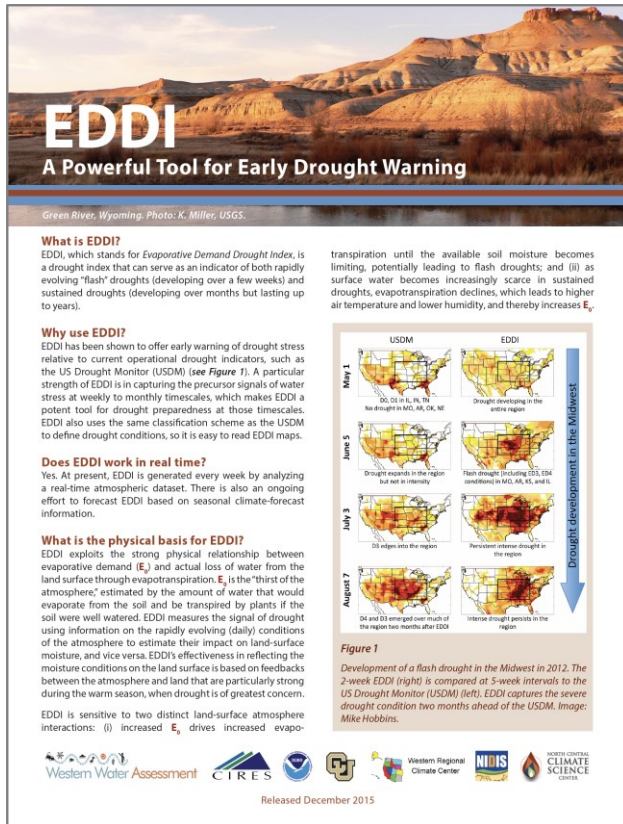


(EDDI-percentile category breaks: 100% = driest; 0% = wettest)

# Next steps

## User outreach, operationalizing, research

### Two-pager:



### Next steps:

- Operationalizing EDDI at NOAA National Water Center
- Enlarge and engage user-base
- EDDI User's Manual
- Continued research and development collaboration with research partners (DRI):
  - attribution component
  - forecast component
  - wildfire prediction

(2-pager: Rangwala et al., NOAA 2015)

# Drivers of drought

$$E_0 = f(T, R_d, q, U_2), \text{ so}$$

$$\Delta E_0 = \frac{\partial E_0}{\partial T} \Delta T + \frac{\partial E_0}{\partial R_d} \Delta R_d + \frac{\partial E_0}{\partial q} \Delta q + \frac{\partial E_0}{\partial U_2} \Delta U_2$$

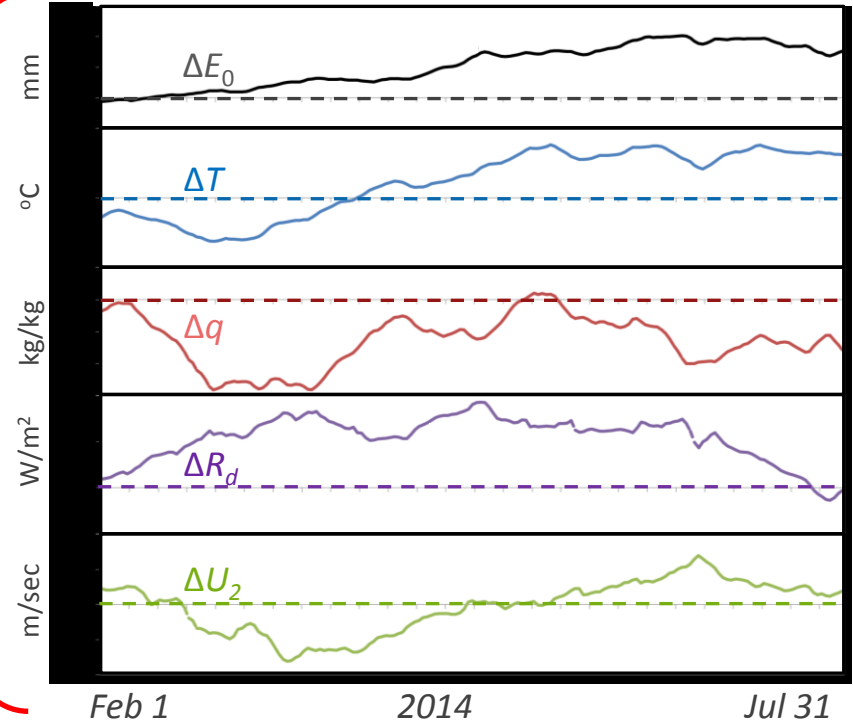
anomalies  
observed in  
reanalyses

derived  
analytically  
(Hobbins, 2016)

$E_0$  changes due to changes in:

$T$ , temperature  
 $R_d$ , solar radiation  
 $q$ , humidity  
 $U_2$ , wind speed

Sacramento River basin, CA



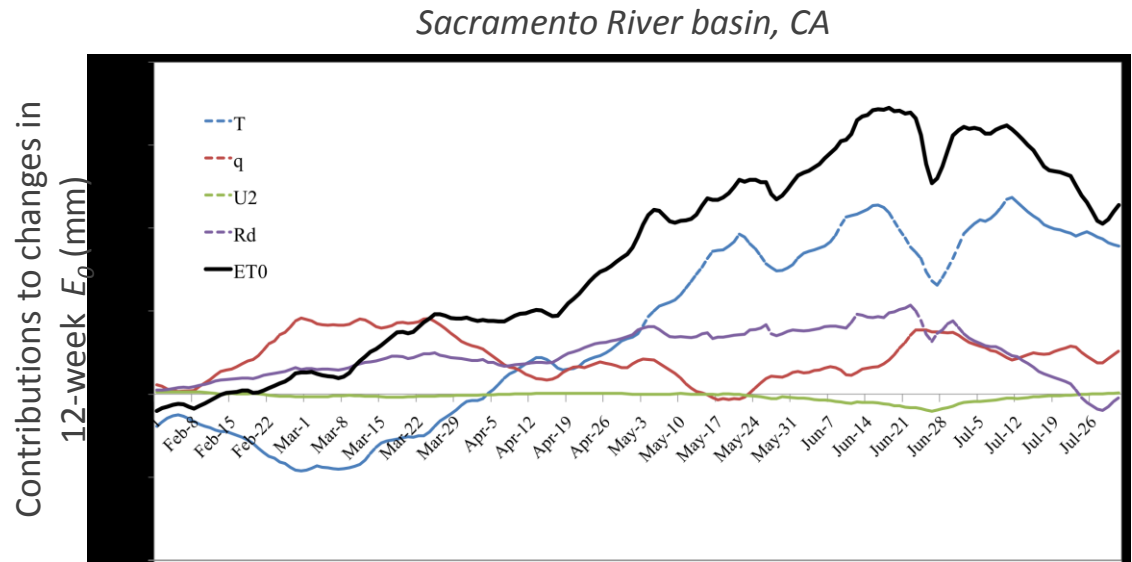
(Hobbins et al., JHM 2016)

# Drivers of drought

Drought intensification  
(increasing  $E_0$ ) forced by:

- first, below-normal  $q$   
(while  $T$  falling)
- then, increasing  $T$  and,  
to a lesser degree,  $R_d$
- $U_2$  plays little role

$T$  = air temperature  
 $R_d$  = downwelling SW  
 $q$  = specific humidity  
 $U_2$  = wind speed



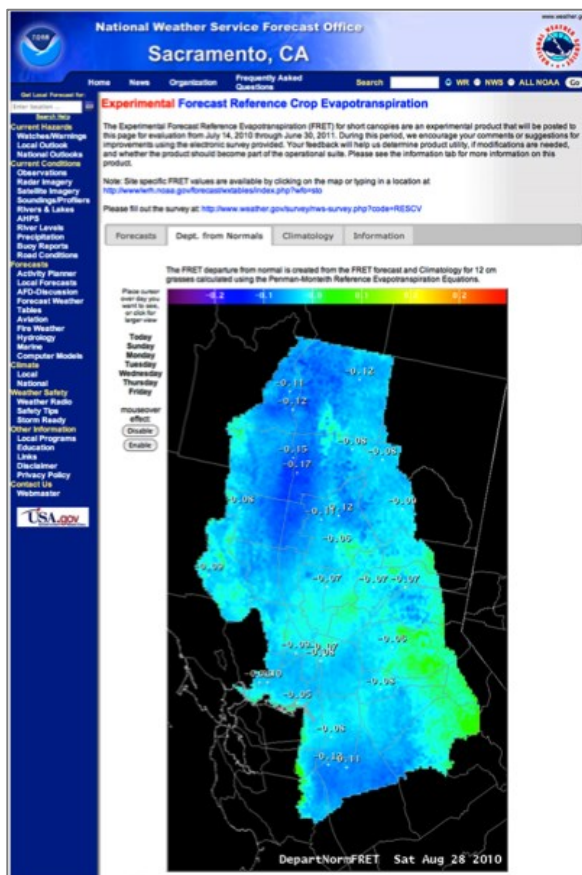
(Hobbins et al., JHM 2016)



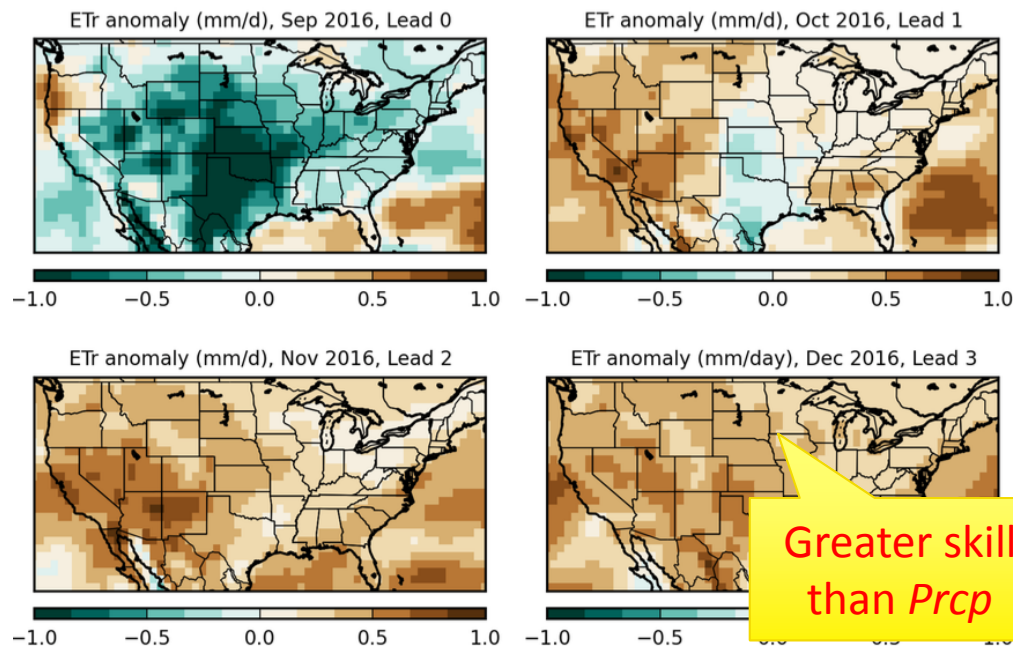
# Forecasting of $E_0$ (and drought)

FRET = Forecast Reference Evapotranspiration  
 $Prcp$  = precipitation

## Daily, weekly - FRET



## Seasonally

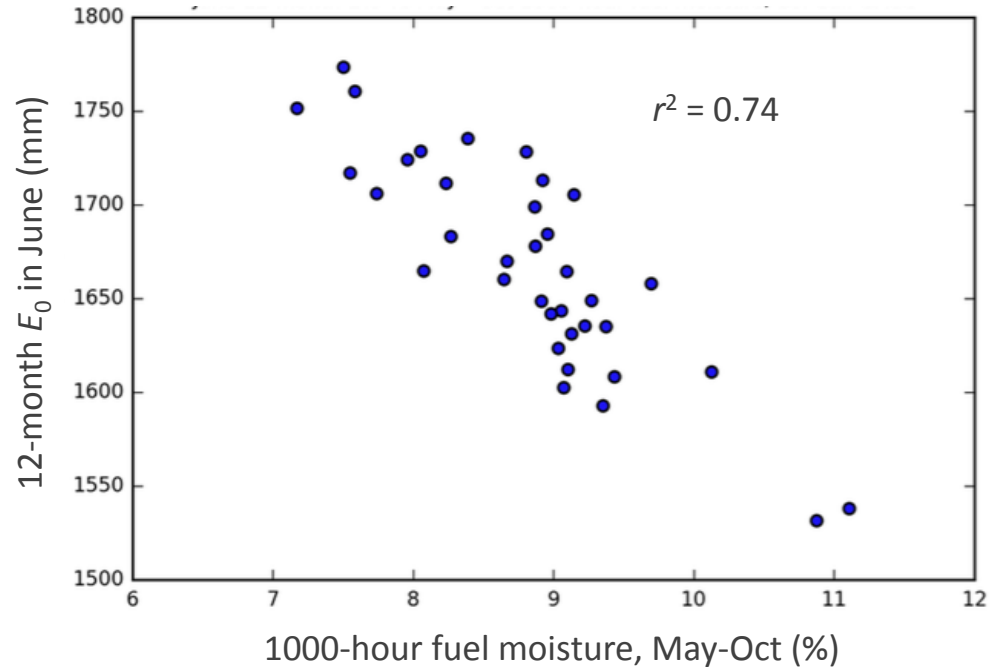


CFSv2 4-member ensemble mean initialized Sept 8  
 (00Z, 06Z, 12Z, and 18Z) – Dan McEvoy, DRI

(McEvoy et al., GRL 2016)

# Predicting wildfire risk

$E_0$ -fuel load  
relationship across  
S. California GACC



2-year NOAA grant: *Developing a wildfire  
component for the NIDIS CA DEWS*

# Summary

## $E_0$ and drought:

Physically rational relationship to drought

More readily available than  $ET$  (than  $Prcp$ , often)

- latency can be significant

Permits decomposition of evaporative drought drivers

$E_0$  (and EDDI, drought) is forecastable (*McEvoy et al.*, GRL 2016)

## Evaporative Demand Drought Index (EDDI):

Examines drought from demand side

- $E_0$ , not  $Prcp$

Near-real-time drought monitoring and early warning

- agricultural drought
- hydrologic drought
- fire-weather prediction

Multi-scalar in time and space

Aggregation window may be calibrated for:

- early warning relative to other monitors,
- demands specific to hydroclimates, and sectors.





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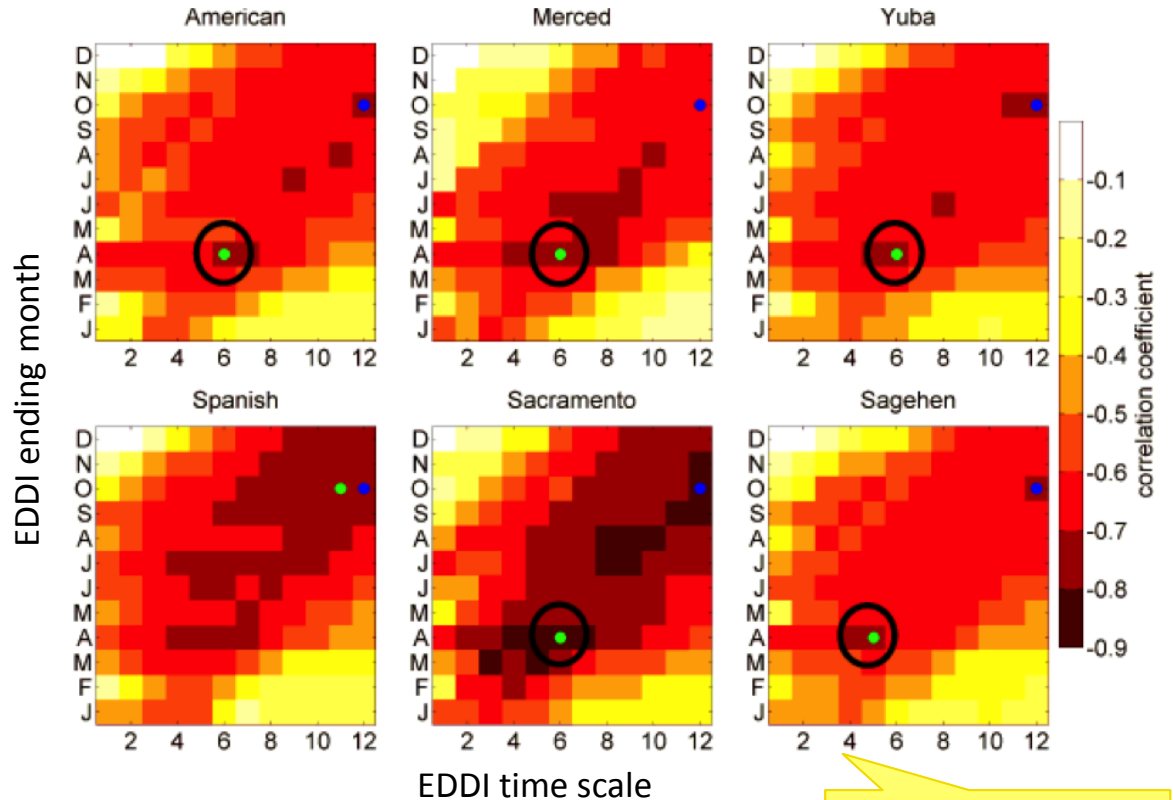
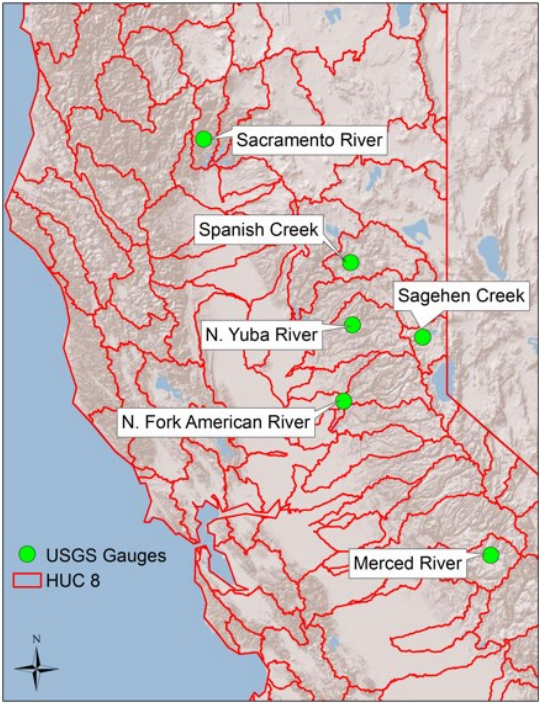
# $E_0$ / $ET$ interactions in drought

In both drought types,  
 $E_0$  increases.

*(Hobbins et al., 2004)*

# EDDI and hydrologic drought

## 12-month SRI vs. 6-month EDDI

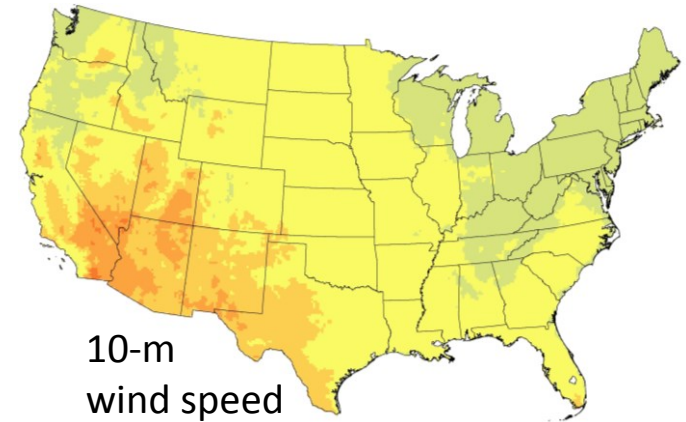
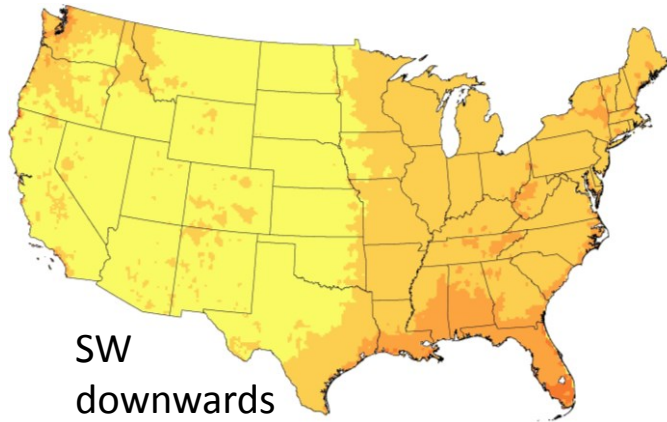
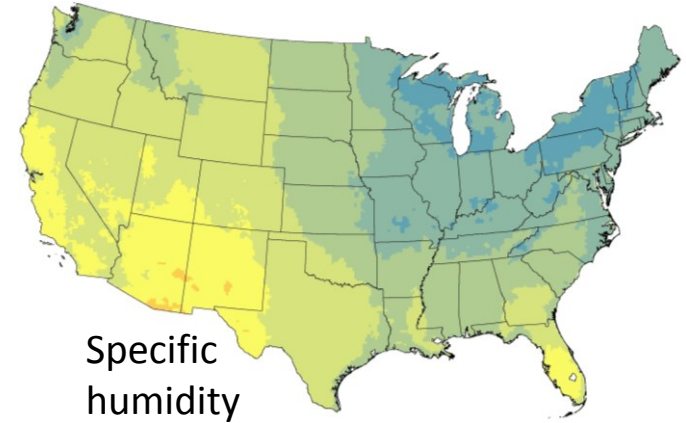
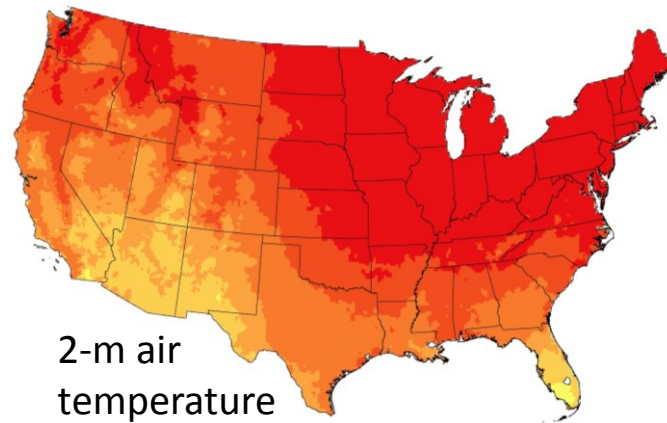


- At 5 sites, 6-month EDDI (Nov-Apr) shows strongest relationship to SRI.
- October-April  $E_0$  explains greatest variance in WY streamflow (i.e., Oct 1-Sep 30).
- Highlights EDDI's predictive capability.

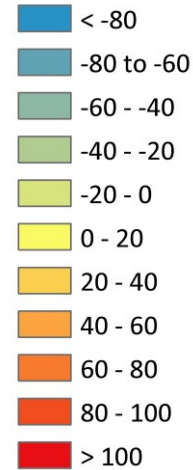
EDDI contains no  
Prpc information!

# Rigorous $E_0$ variability analysis

MJJASO variability contributions, daily  $ET_0$ , by driver



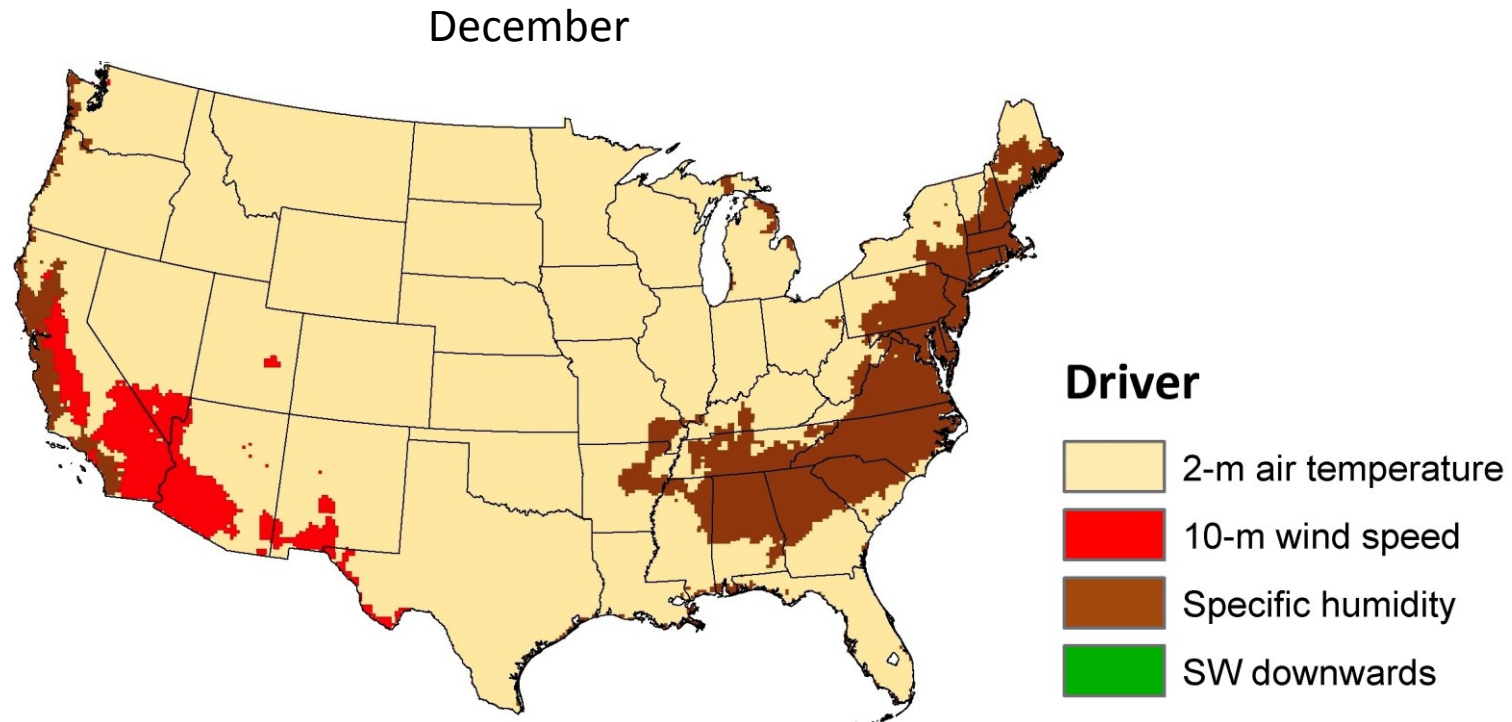
% contribution



*Hobbins et al., Trans. ASABE, 2016*

# Rigorous $E_0$ variability analysis

Top driver of daily variability, by month

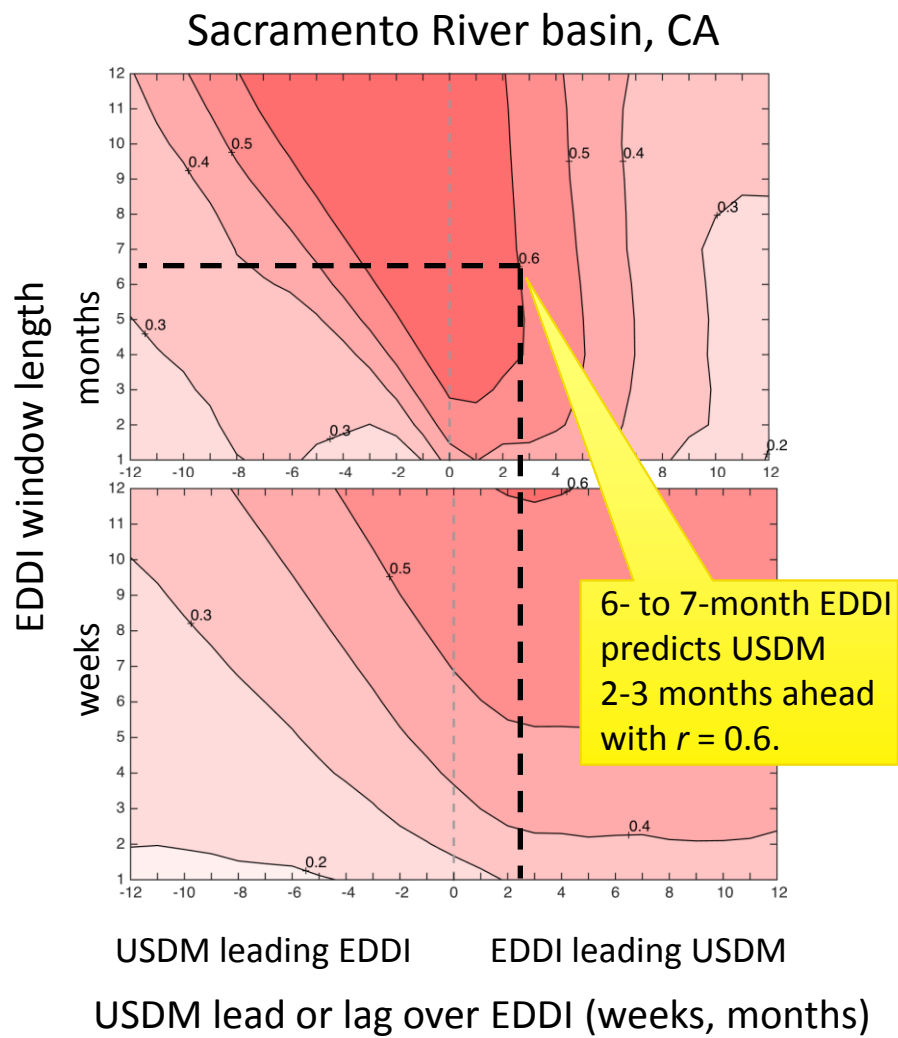


*Hobbins et al., Trans. ASABE, 2016*

# EDDI as a leading indicator of drought

Optimizing EDDI window-length is straightforward.

Here, EDDI is optimized against USDM for the Sacramento River basin.



# FRET – in a nutshell

Forecast estimate of  $ET_0$  for 24-hour period:

Deterministic forecast:

- no ensemble forecasts

Time-and space specs:

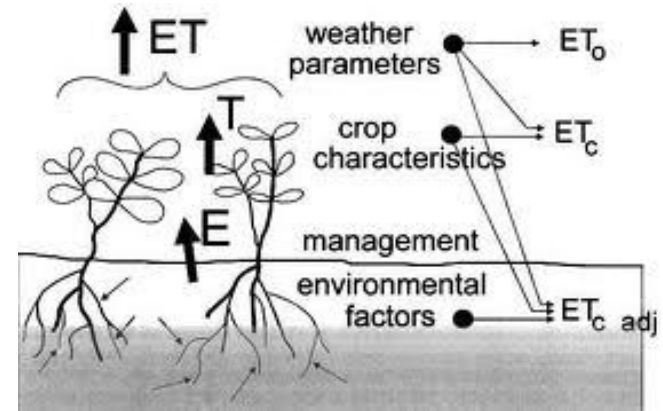
- 1- to 7-day lead time
- 24-hour periods run 6z to 6z
- HRAP grid (~2.5 kms)

Penman-Monteith (ASCE):

- 12-cm grass reference crop

Drivers:

- sensible weather elements from coupled NWP
  - $T_{max}$ ,  $T_{min}$
  - $RH_{max}$ ,  $RH_{min}$
  - 10-m wind speed
  - Sky (cloud cover %)



drivers forecasted by loading data from a model (or blend of models), expertly tweaked for consistency with neighboring WFOs / specific local conditions,  
- e.g., for wind: may load local WRF data and then increase areas in the Delta for Delta breeze.



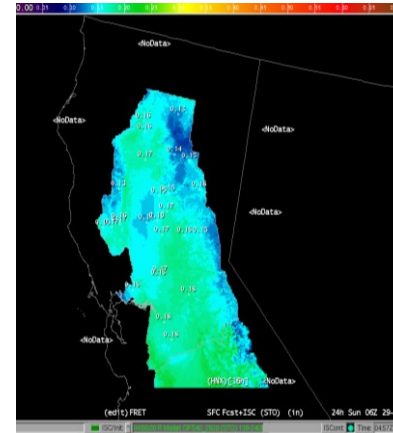
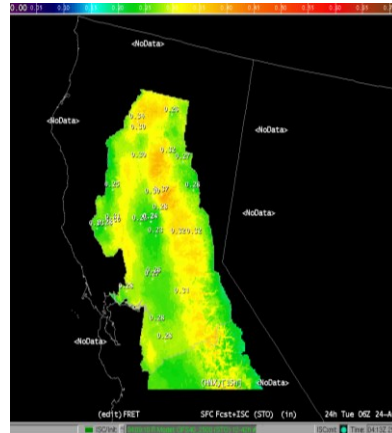
# Short-term forecasting of $ET_0$

Example forecasts, 1-day FRET

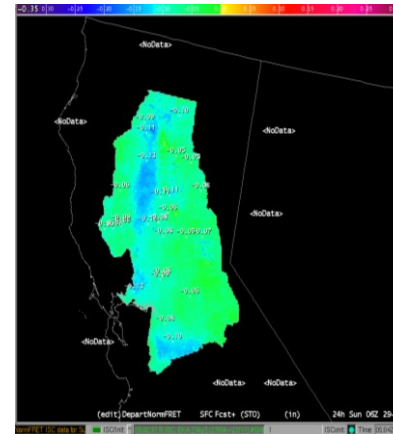
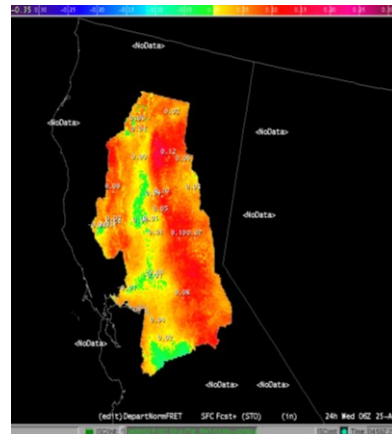
Aug 24, 2013 - hot

Aug 29, 2013 - cool

Forecast:  
1-day FRET



Anomaly:  
 $FRET_{1d} - ET_0$

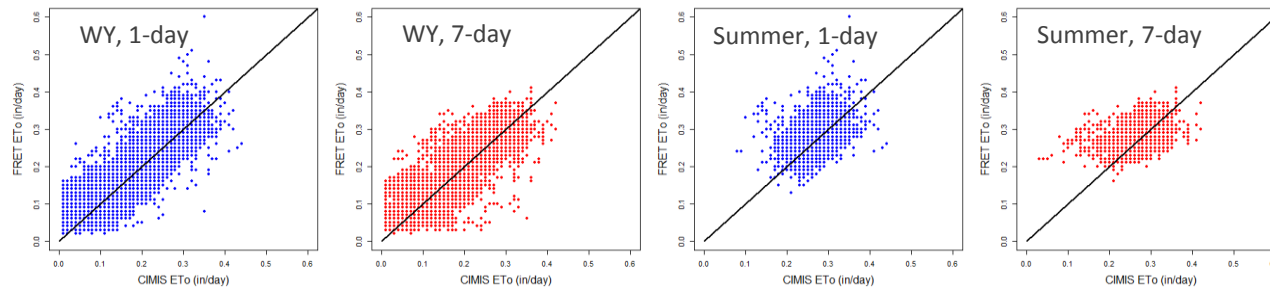




# Short-term forecasting of $ET_0$

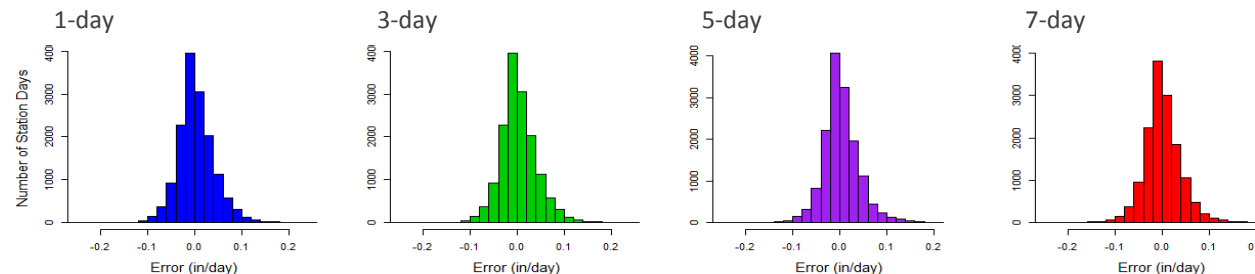
## FRET verification

Water year (WY) and summer FRET  $ET_0$  vs. CIMIS observations



> 80% of FRET values within 0.05 in/day of observed  $ET_0$  for all forecast periods.

FRET – CIMIS observation for 48 stations

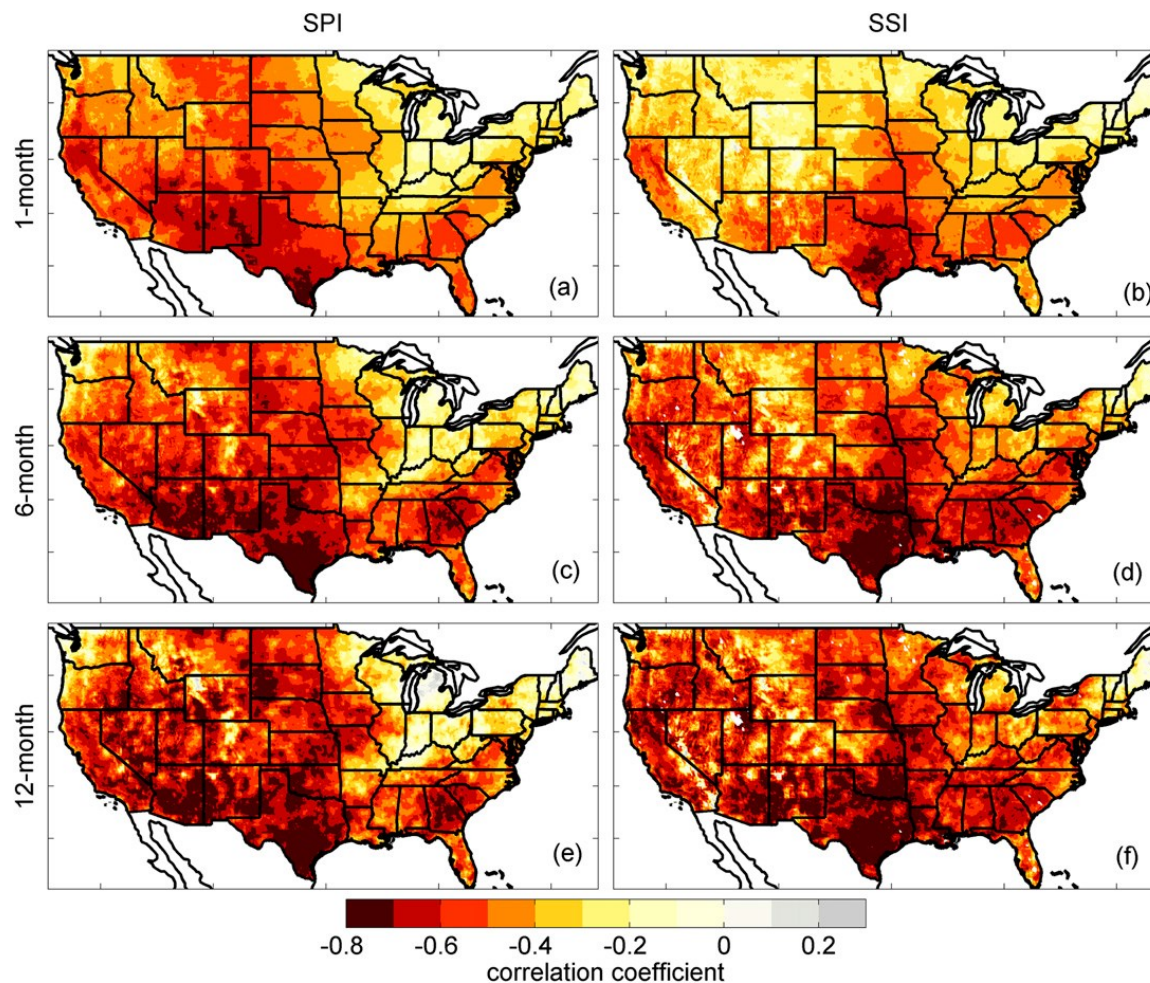


FRET has slight +ve bias wrt observed  $ET_0$ , increased bias in summer.

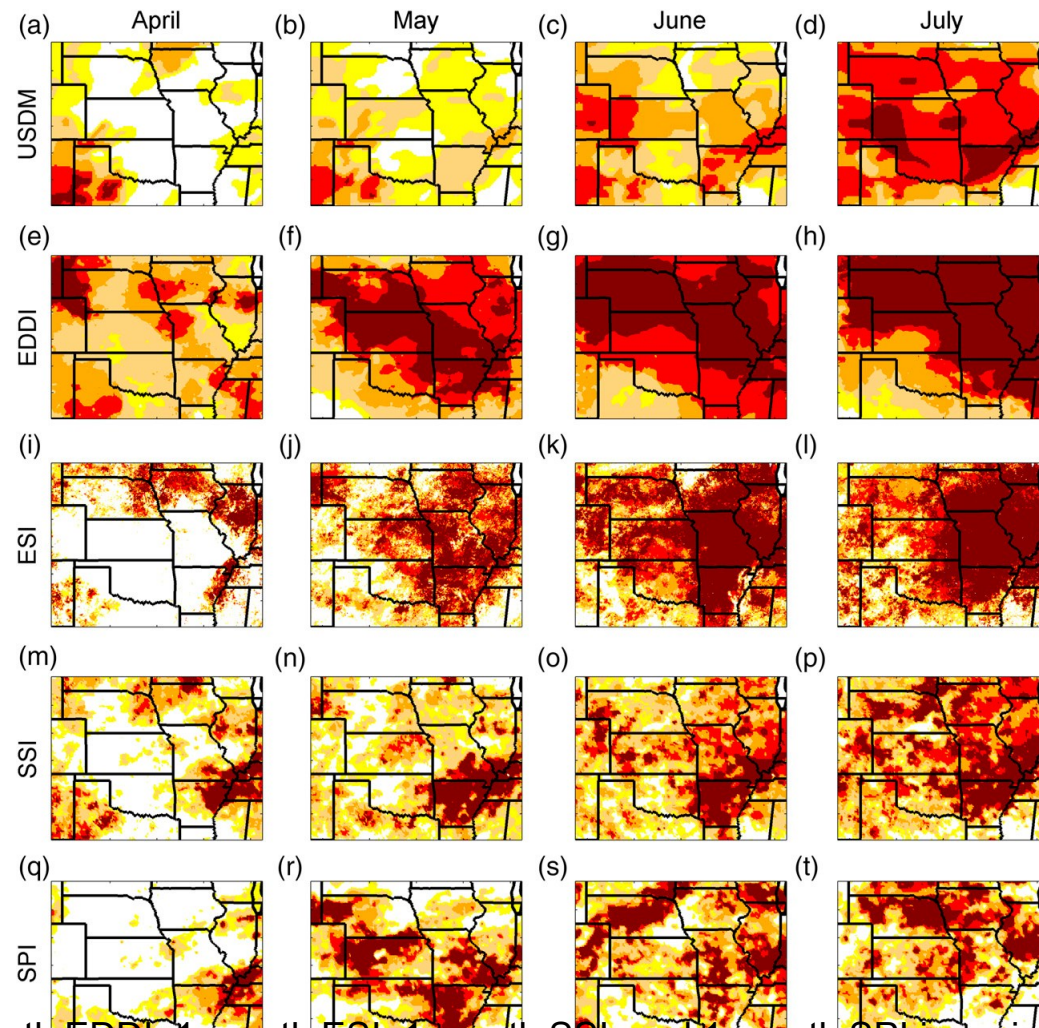
2012 Water Year

2012 Summer

FRET forecast period	BIAS (in/day)	MBE (-)	MAE (in/day)	BIAS (in/day)	MBE (-)	MAE (in/day)
1-day	0.006	0.18	0.029	0.015	0.07	0.036
3-day	0.006	0.18	0.028	0.015	0.08	0.034
5-day	0.006	0.18	0.028	0.013	0.08	0.032
7-day	0.004	0.17	0.028	0.012	0.07	0.032

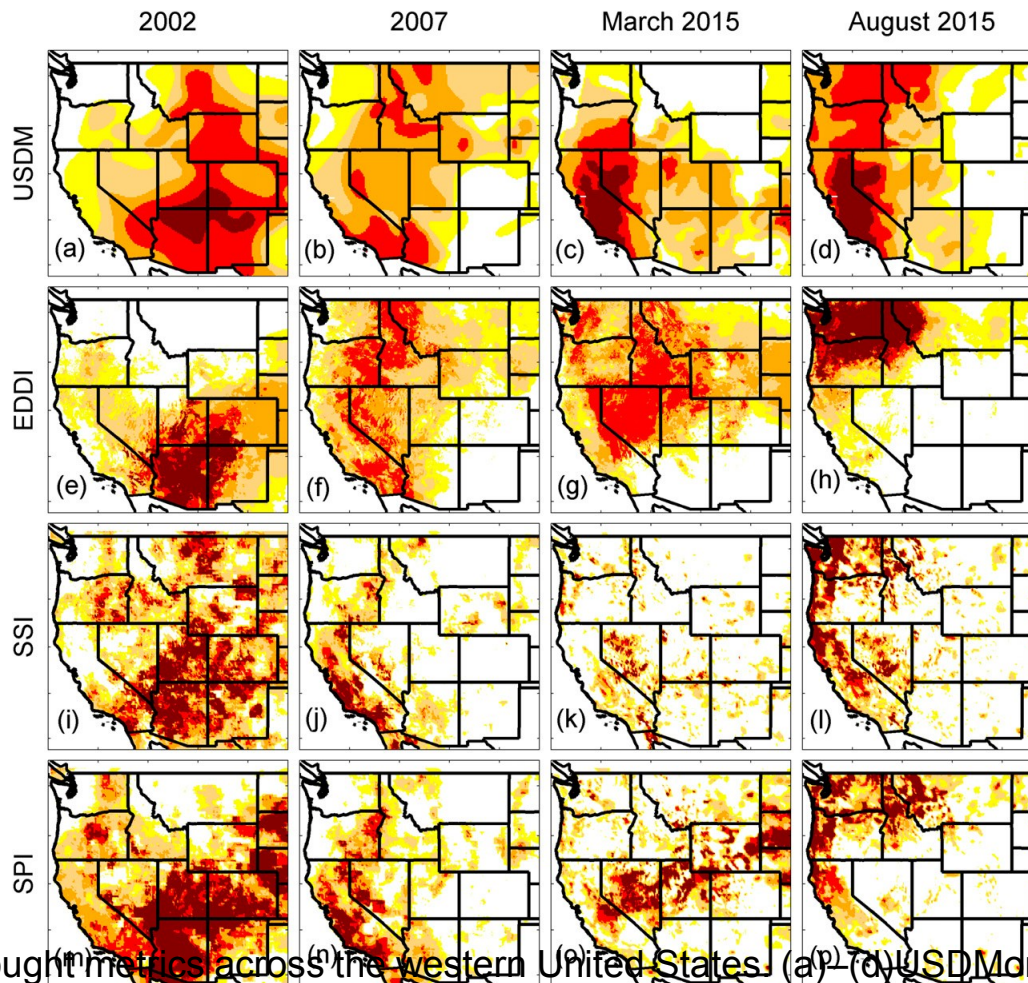


Correlation coefficients between EDDI and SPI at (a) 1-month, (c) 6-month, and (e) 12-month time scales and between EDDI and SSI at (b) 1-month, (d) 6-month, and (f) 12-month time scales. Correlations were computed at each grid point for 1979–2013 over each month ( $n = 35$ ) and then averaged over all months in each time scale.

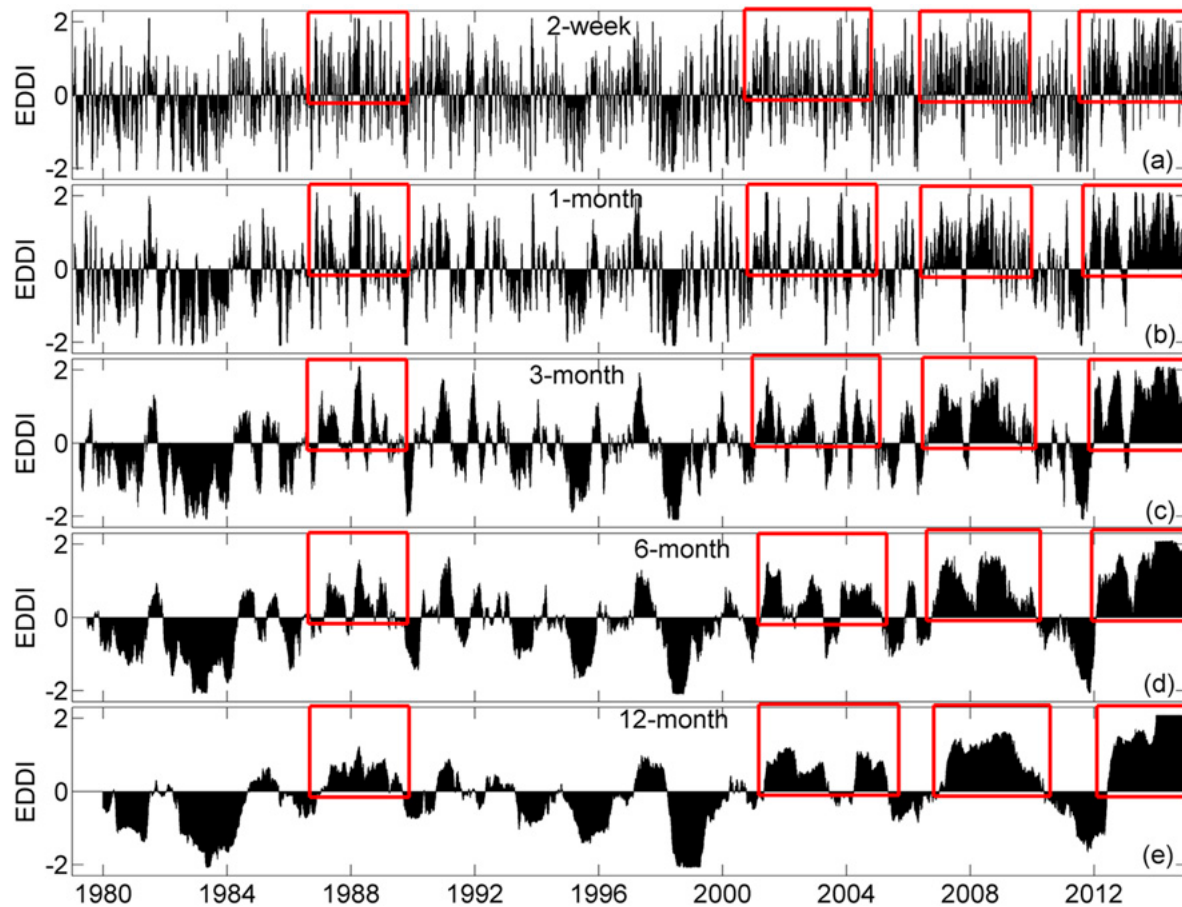


Evolution of USDM, 1-month EDDI, 1-month ESI, 1-month SSI, and 1-month SPI in spring to summer of 2012. USDM data are from (a) 1 May, (b) 5 Jun, (c) 3 Jul, and (d) 31 Jul 2012. (e)–(h) EDDI, (i)–(l) ESI, (m)–(p) SSI, and (q)–(t) SPI are at 1-month time scales at the end of each month. All drought metrics have been converted to USDM categories.





Spatial comparison of drought metrics across the western United States. (a)–(d) USD on 25 Jun 2002, 2 Oct 2007, 31 Mar 2015, and 1 Sep 2015; (e)–(h) 6-month EDDI in June 2002, 12-month EDDI in September 2007, 6-month EDDI in March 2015, and 6-month EDDI in August 2015; (i)–(l) 6-month SSI in June 2002, 12-month SSI in September 2007, 6-month SSI in March 2015, and 6-month SSI in August 2015; and (m)–(p) 6-month SPI in June 2002, 12-month SPI in September 2007, 6-month SPI in March 2015, and 6-month SPI in August 2015.



Area-averaged time series of EDDI over the northern Sierra Nevada from 1979 to 2014 aggregated at (a) 2-week, (b) 1-month, (c) 3-month, (d) 6-month, and (e) 12-month time scales. Red boxes highlight the four most prominent hydrologic droughts during the time period.