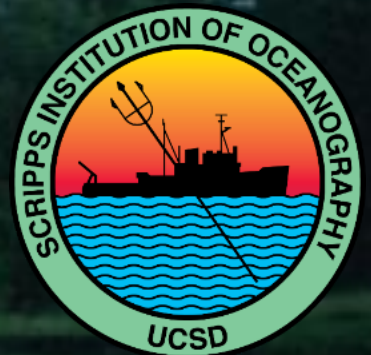


# Opportunities for Improving S2S Forecasting in the West: Extreme Precipitation and Atmospheric Rivers

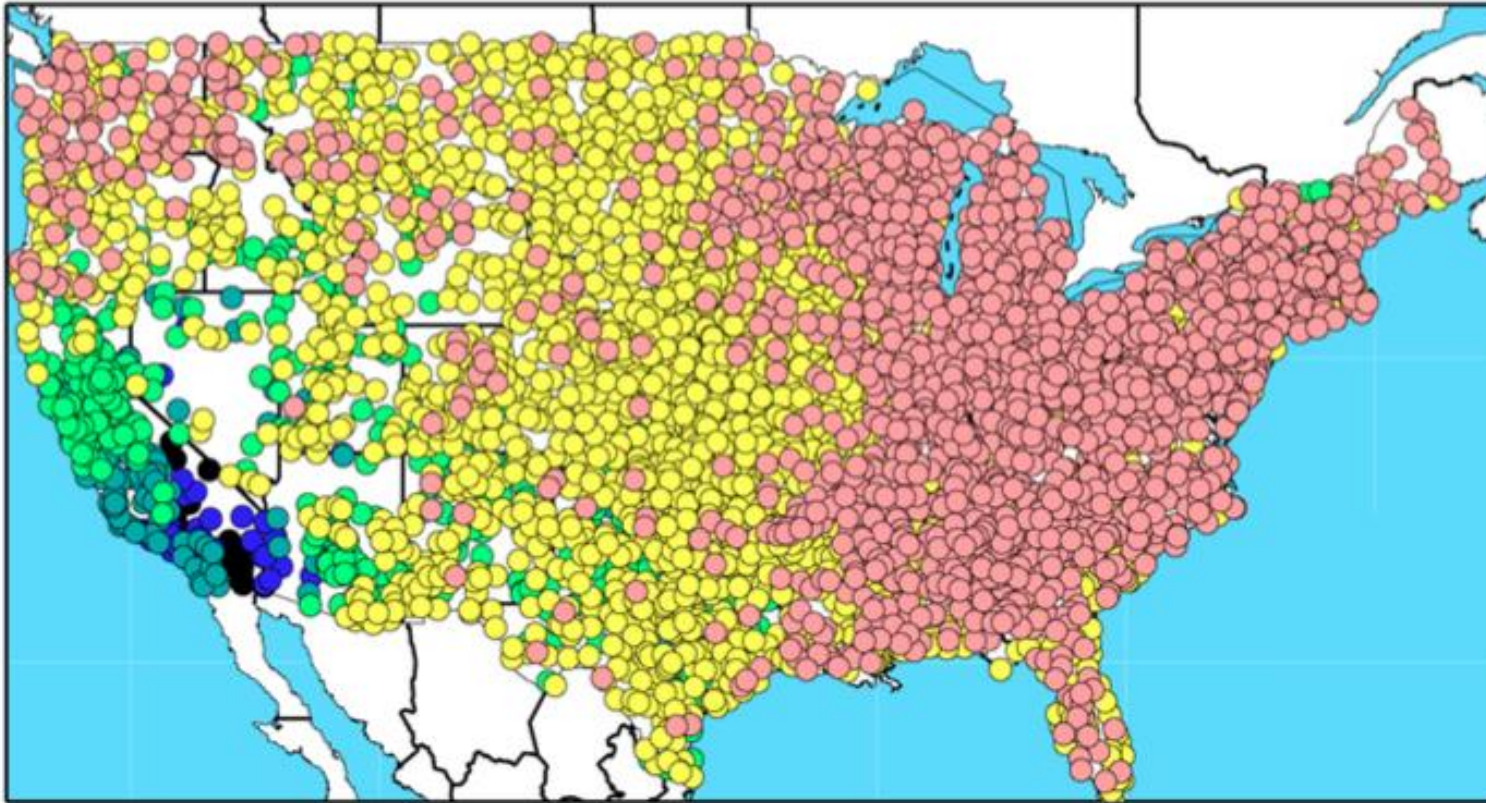
F. Martin Ralph

UC San Diego/Scripps Institution of Oceanography

Sub-Seasonal and Seasonal Precipitation Forecasting and FIRO  
Western States Water Council and California Dept. of Water Resources  
28 September 2016, St. George Utah



# Variability of Annual Precipitation



Dettinger et al. 2011

fraction



Coefficient of variation for annual precipitation 1950-2008

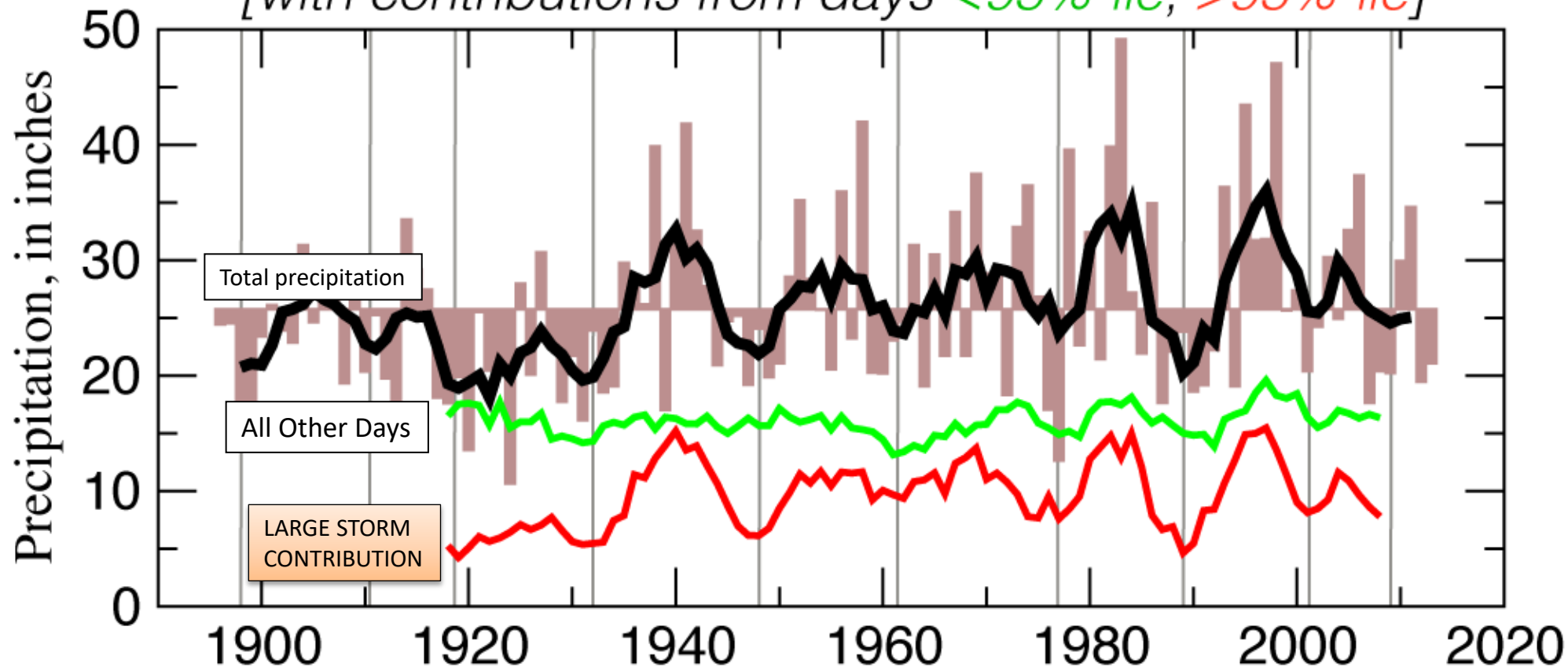
- CA has the largest year to year precipitation variability in the US.
- CA variability is on the order of half the annual average.
- The year to year variability in CA is largely caused by the wettest days (ARs).

## A few large storms (or their absence)

account for a disproportionate amount of California's precipitation variability

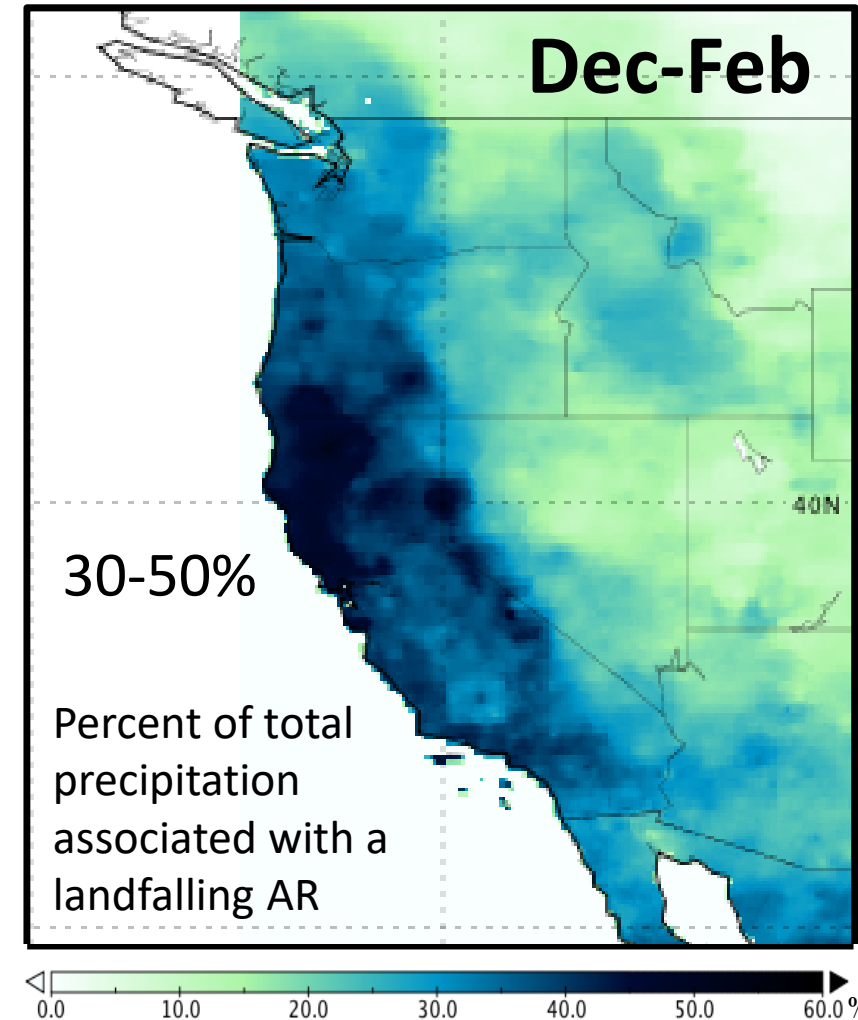
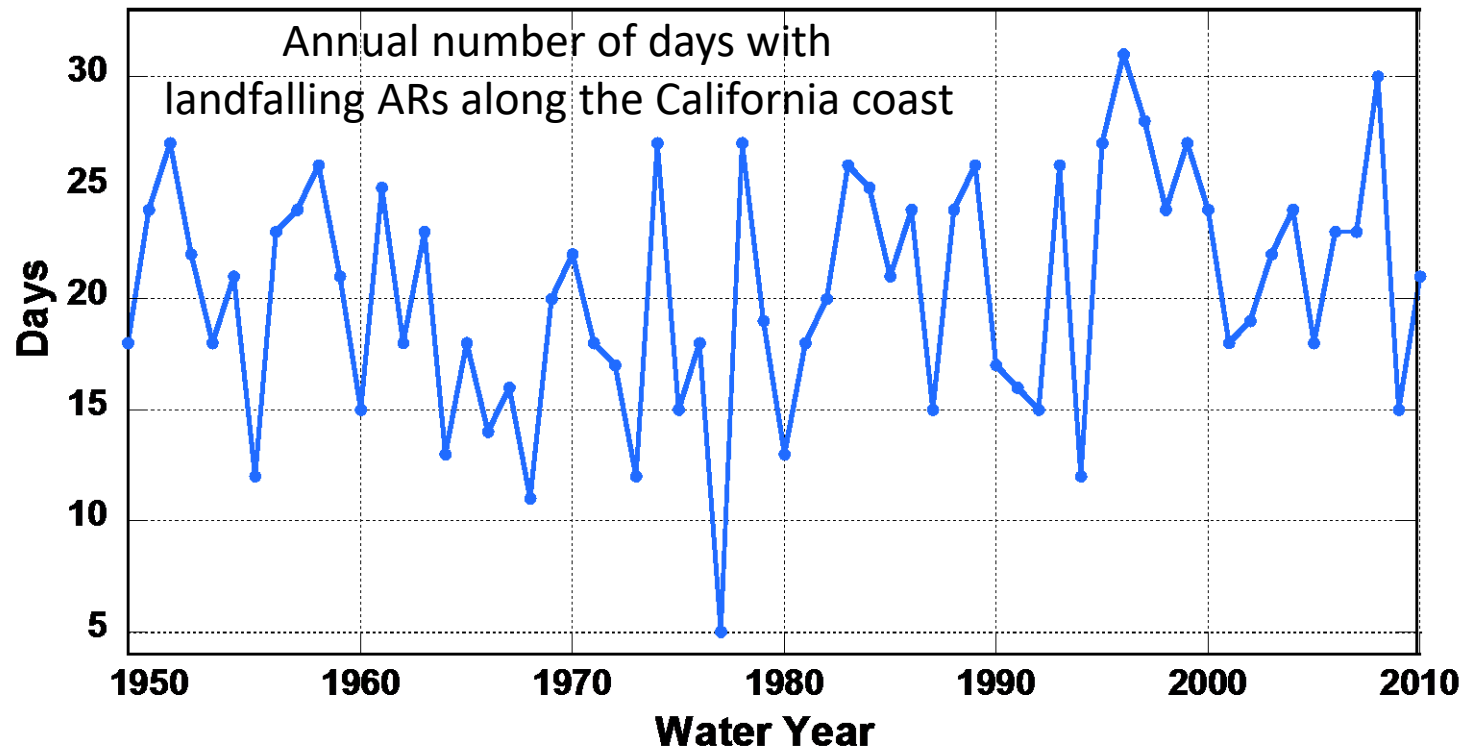
### a) Water-Year Precipitation, Delta Catchment

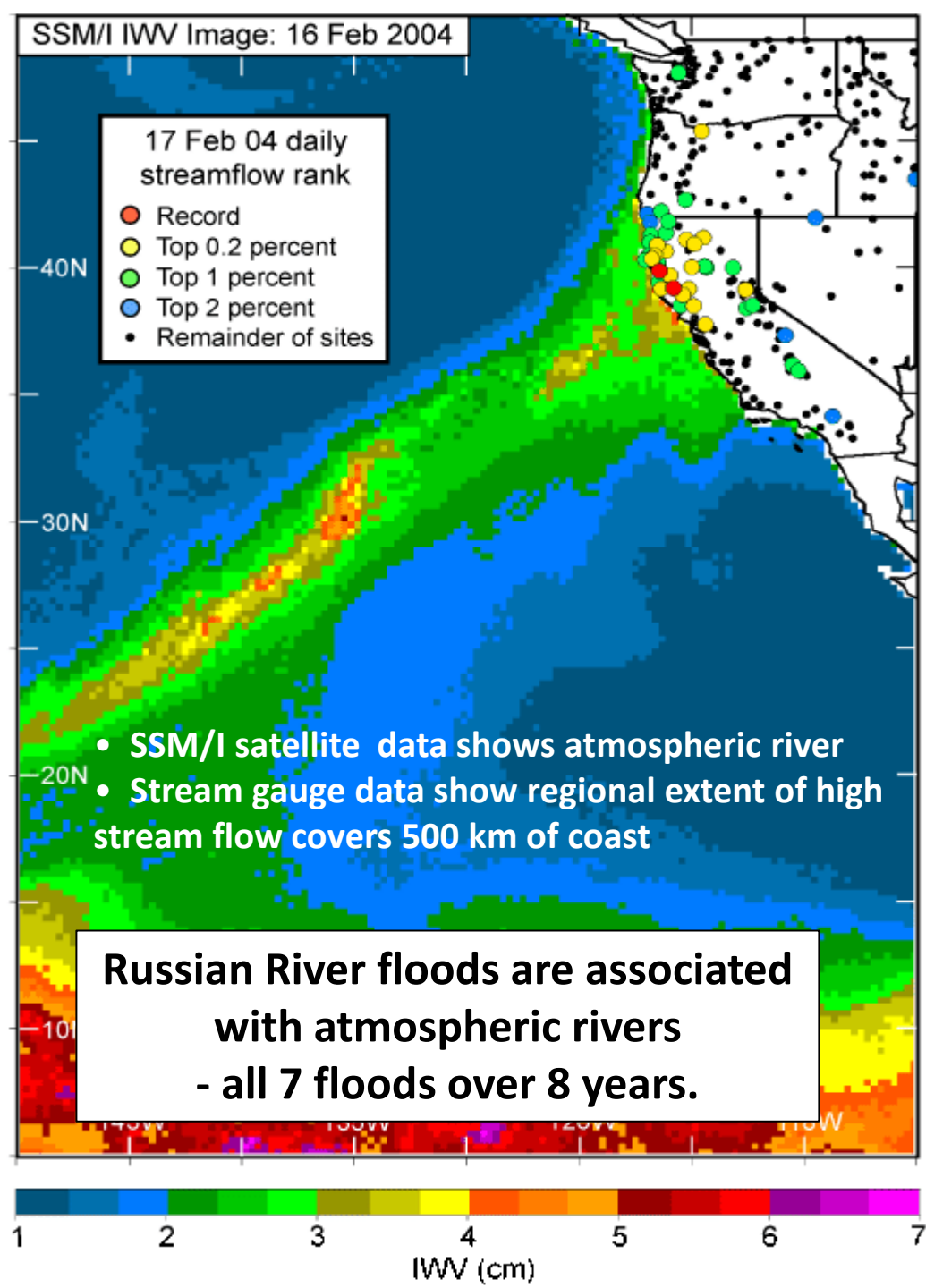
[with contributions from days <95%-ile, >95%-ile]



# Preliminary Application of New AR Detection Scheme to Reanalysis Output

**Count Landfalling ARs (32-42°N)**





## Flooding on California's Russian River: Role of atmospheric rivers

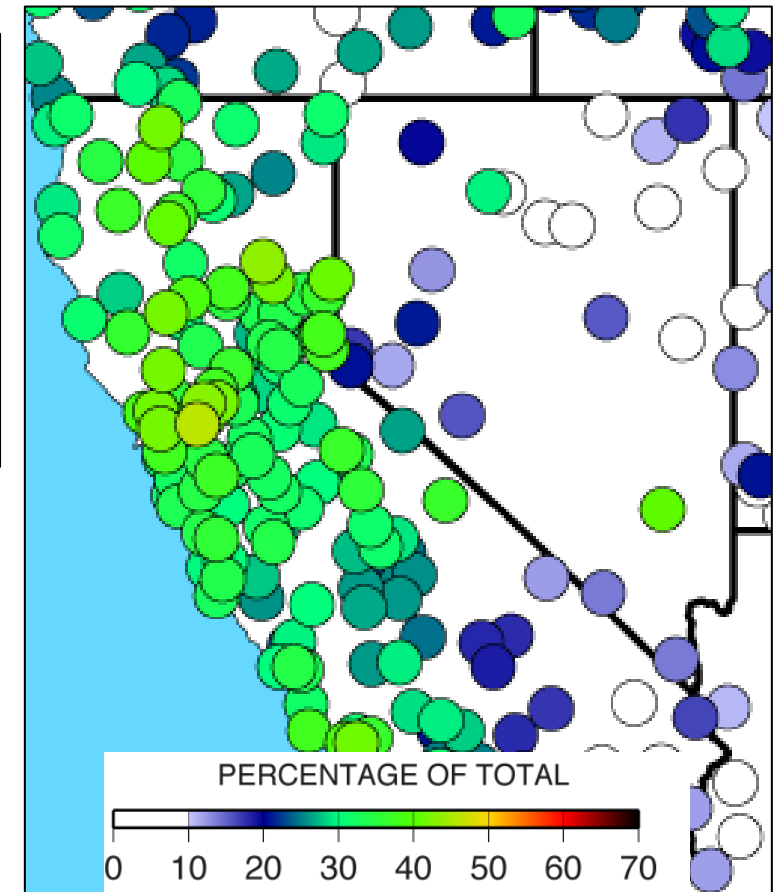
Ralph, F.M., P. J. Neiman, G. A. Wick, S. I. Gutman, M. D. Dettinger, D. R. Cayan, A. White (*Geophys. Res. Lett.*, 2006)



*ARs can  
CAUSE FLOODS  
and PROVIDE  
WATER SUPPLY*

### Atmospheric Rivers, Floods and the Water Resources of California

Mike Dettinger, M. Ralph, , T. Das, P. Neiman, D. Cayan (*Water*, 2011)



# Rivers in the Sky

## Rivers in the Sky

An atmospheric river is a narrow conveyor belt of vapor that extends thousands of miles from out at sea, carrying as much water as 15 Mississippi Rivers. It strikes as a series of storms that arrive for days or weeks on end. Each storm can dump inches of rain or feet of snow.

### Orientation

If a river strikes perpendicular to a mountain range, much of the vapor condenses out. If it strikes at an angle (shown), a "barrier jet" can be created that flows along the range, redistributing precipitation on the mountainside.

### Buoyancy

The warm, moist air mass easily rises up and over a mountain range; as it does, the air cools and moisture condenses into abundant rain or snow. The river eventually decays into random local storms.

### Origin

Atmospheric rivers usually approach California from the southwest, bringing warm, moist air from the tropics.

### Duration

A megastorm can last up to 40 days and meander down the coastline. Smaller rivers that arrive each year typically last two to three days; "pineapple expresses" come straight from the Hawaii region.

Atmospheric river

### Precipitation

Several inches of rain or feet of snow can fall underneath an atmospheric river each day. Moderate storms can bring more than 15 inches of rain.

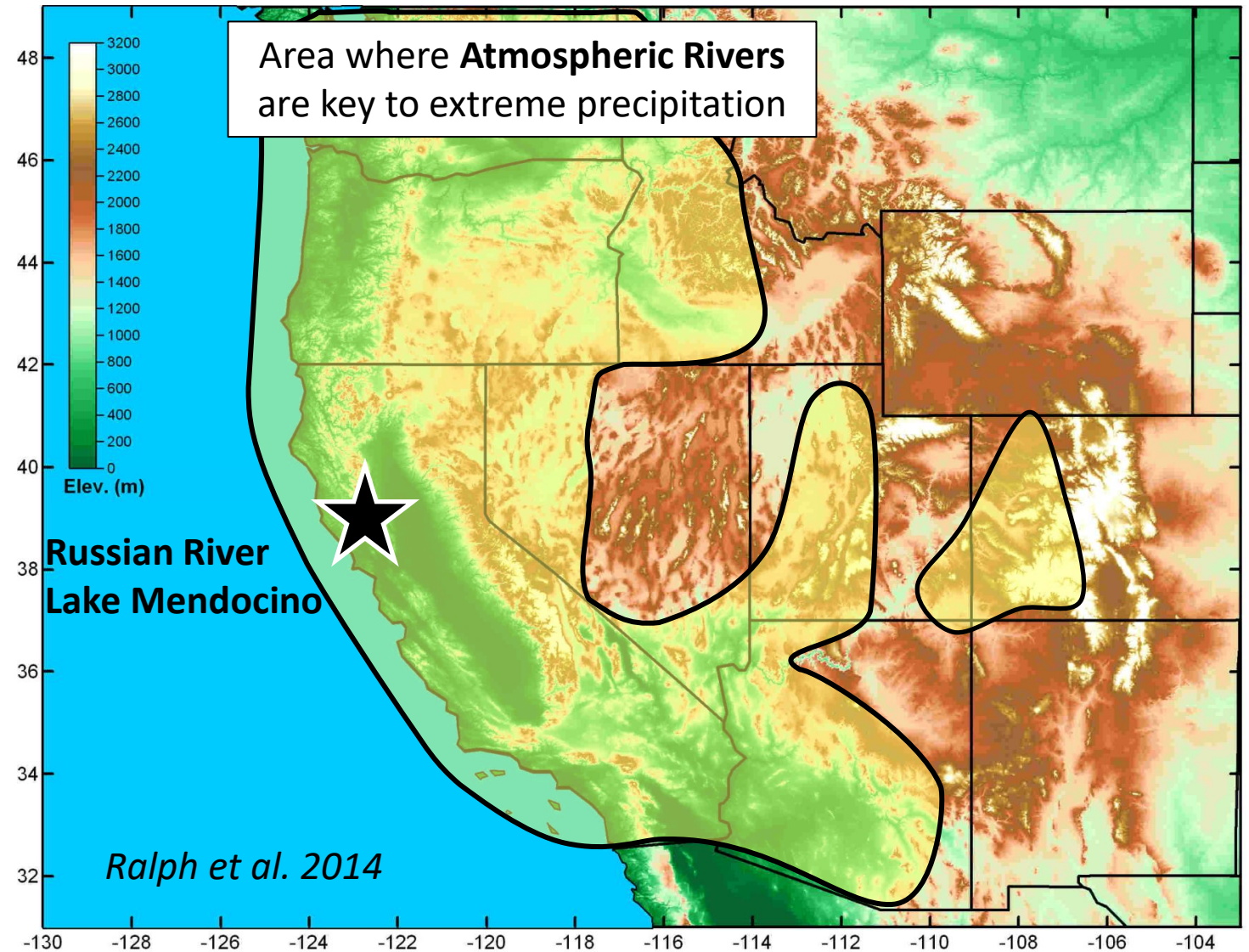
### Vapor Transport

Moisture is concentrated in a layer 0.5 to 1.0 mile above the ocean. Strong winds within the layer bring very humid air from the tropics, but the river can also pull in atmospheric moisture along its path.

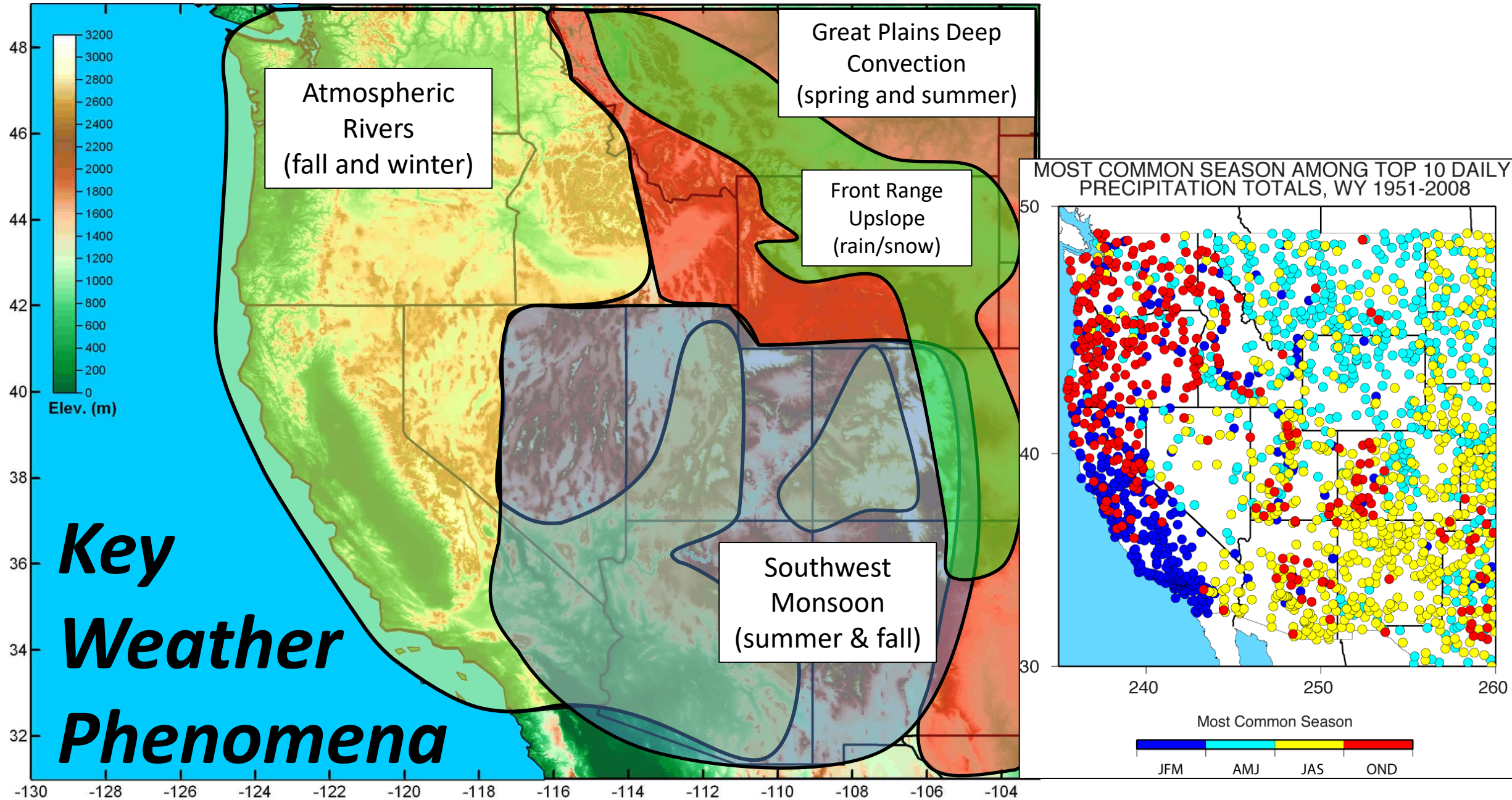
*Dettinger and Ingram 2013*

Not to scale

# ARs Affect Large Areas of the U.S. West



Schematic illustration of regional variations in the primary weather phenomena that lead to extreme precipitation, flooding and contribute to water supply in the Western U.S. (Ralph et al. 2014)



Surface Elevation (m)

0 500 1000 1500 2000 2500

# The Inland Penetration of Atmospheric Rivers over Western North America: A Lagrangian Analysis

J.J. Rutz, J. W. Steenburgh and F.M. Ralph  
*Mon. Wea. Rev.*, 2015

## Regime 1

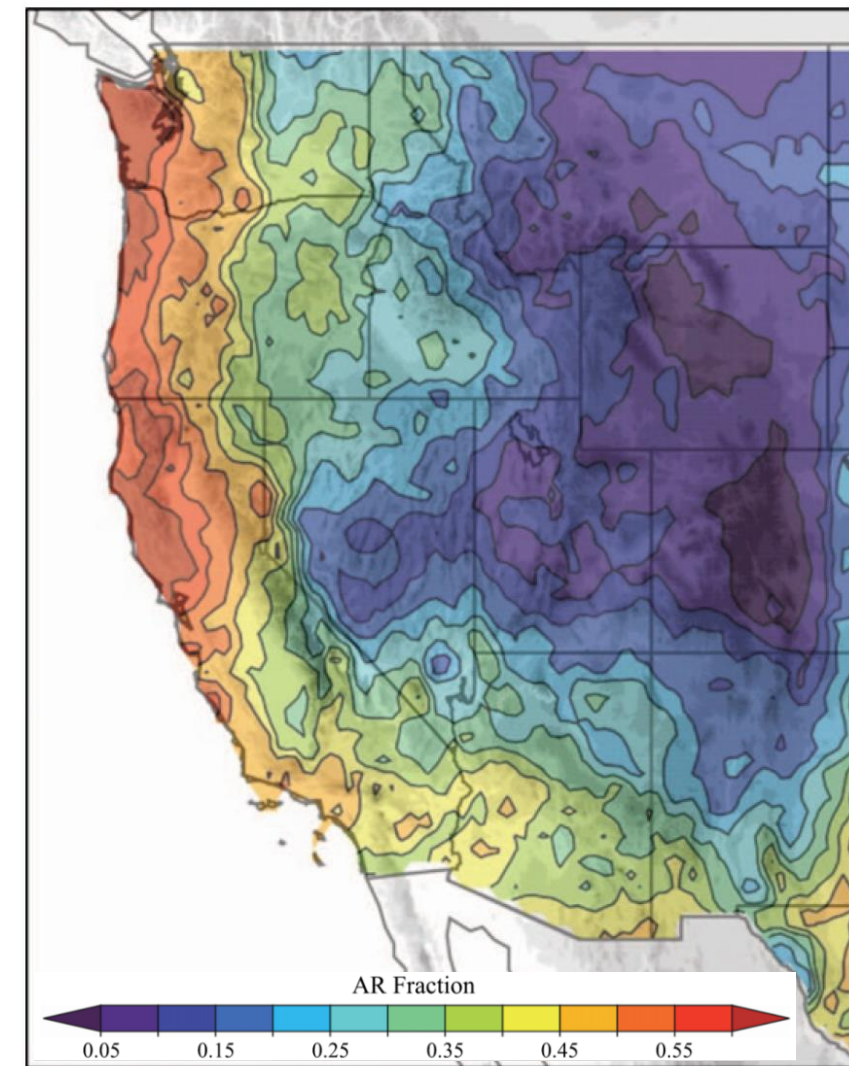
~68% of all landfalling 950-hPa AR-related trajectories;  
~24% become inland penetrating; 7% become interior penetrating

## Regime 2

~24% of all landfalling 950-hPa AR-related trajectories;  
~28% become inland penetrating;  
~4% become interior penetrating

## Regime 3

~8% of all landfalling 950-hPa AR-related trajectories;  
~52% become inland penetrating;  
~12% become interior penetrating

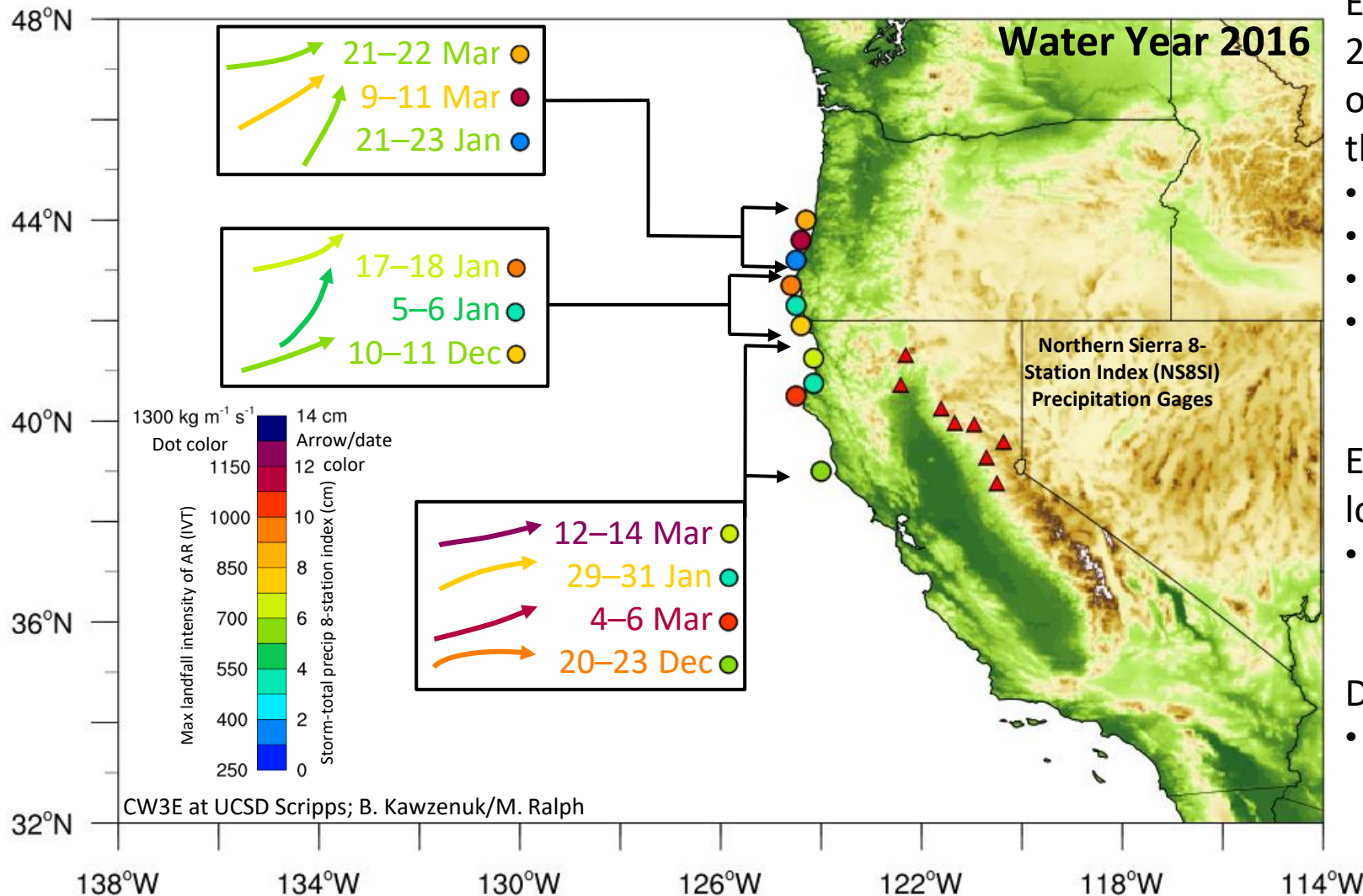


## Climatological Characteristics of Atmospheric Rivers and Their Inland Penetration over the Western United States

J.J. Rutz, J. W. Steenburgh and F.M. Ralph  
*Mon. Wea. Rev.*, 2014

# WY 2016 Storm Summary: Top-10 Wettest Events - Northern Sierra 8-Station Index

## Dates, Landfall Locations, Storm Orientations – All Were Atmospheric Rivers



Each of the top-10 wettest events of WY 2016 were identified and examined in terms of their strength and nature of the storms that produced them

- The 10 events produced 54% of WY16 precip.
- All 10 were atmospheric river (AR) events\*
- All 10 had winds from west or southwest
- All struck NorCal or OR coast and forced water vapor into the northern Sierra/Shasta area

Each dot represents the central landfall location of the associated atmospheric river

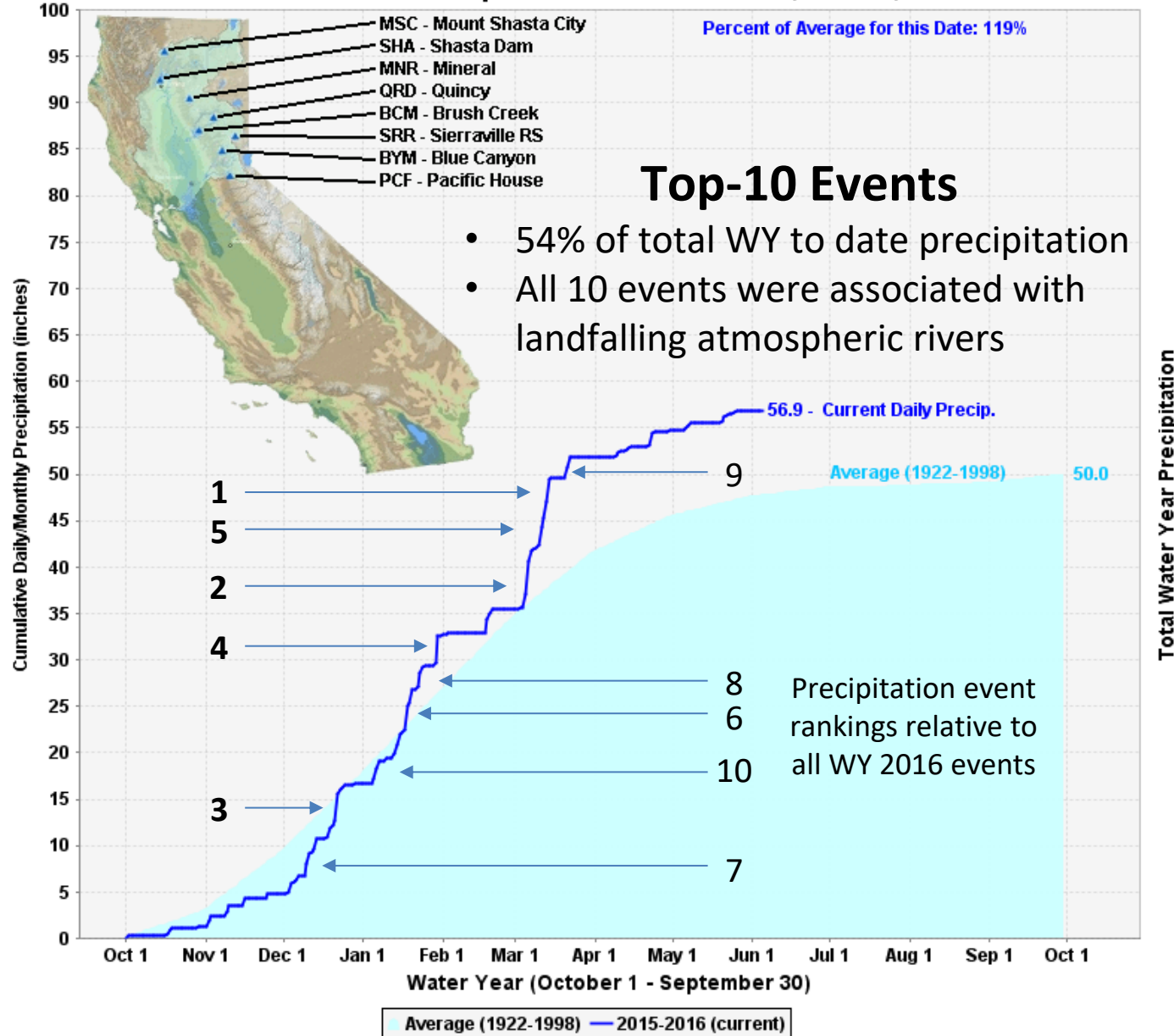
- Dot's color represents the maximum AR strength (i.e., its water vapor transport – IVT)

Dates and AR orientations are shown

- Arrow's color represents total precip. measured by the 8-Station Index in that event (over 48,72, or 96 hours)

\*See Ralph et al. 2016 for study of the relationship between NS8SI extreme events and landfalling ARs

## Northern Sierra Precipitation: 8-Station Index, June 5, 2016

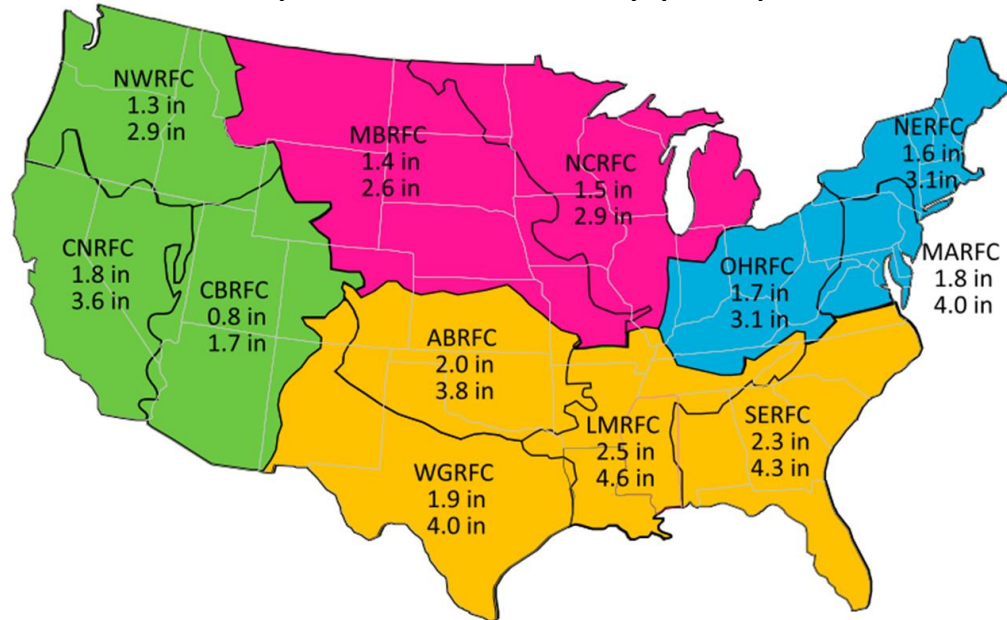


# Predictions

# Extreme quantitative precipitation forecast performance at the Weather Prediction Center from 2001 to 2011

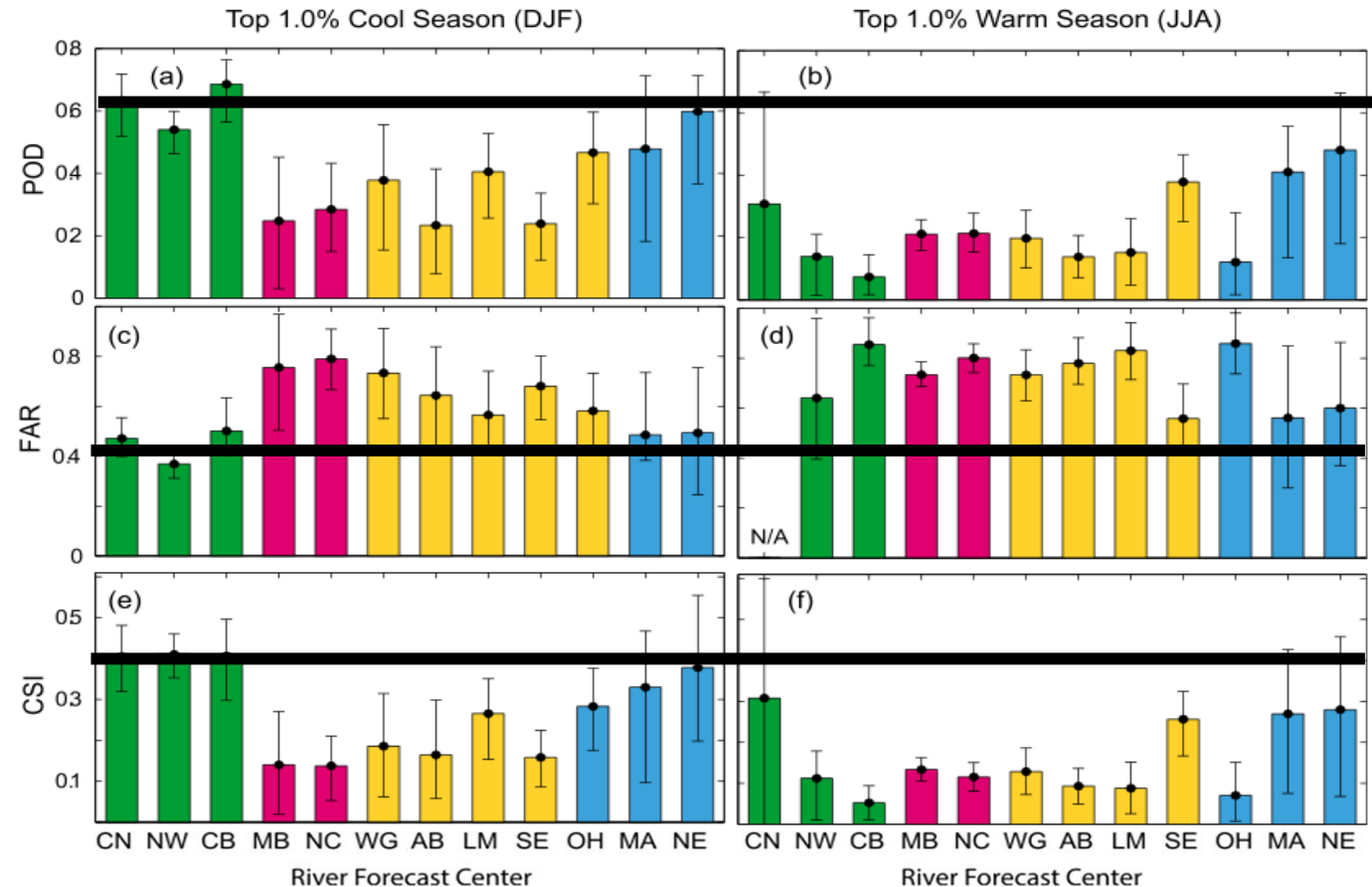
Sukovich, E. M., F. M. Ralph, F. E. Barthold, D. W. Reynolds and D. R. Novak *Wea. Forecast.* (2014)

Regional thresholds for  
Top 1% heaviest daily precipitation



Used 32 km gridded QPE from NCEP/WPC from 2001-2011  
>12,000,000 wet days

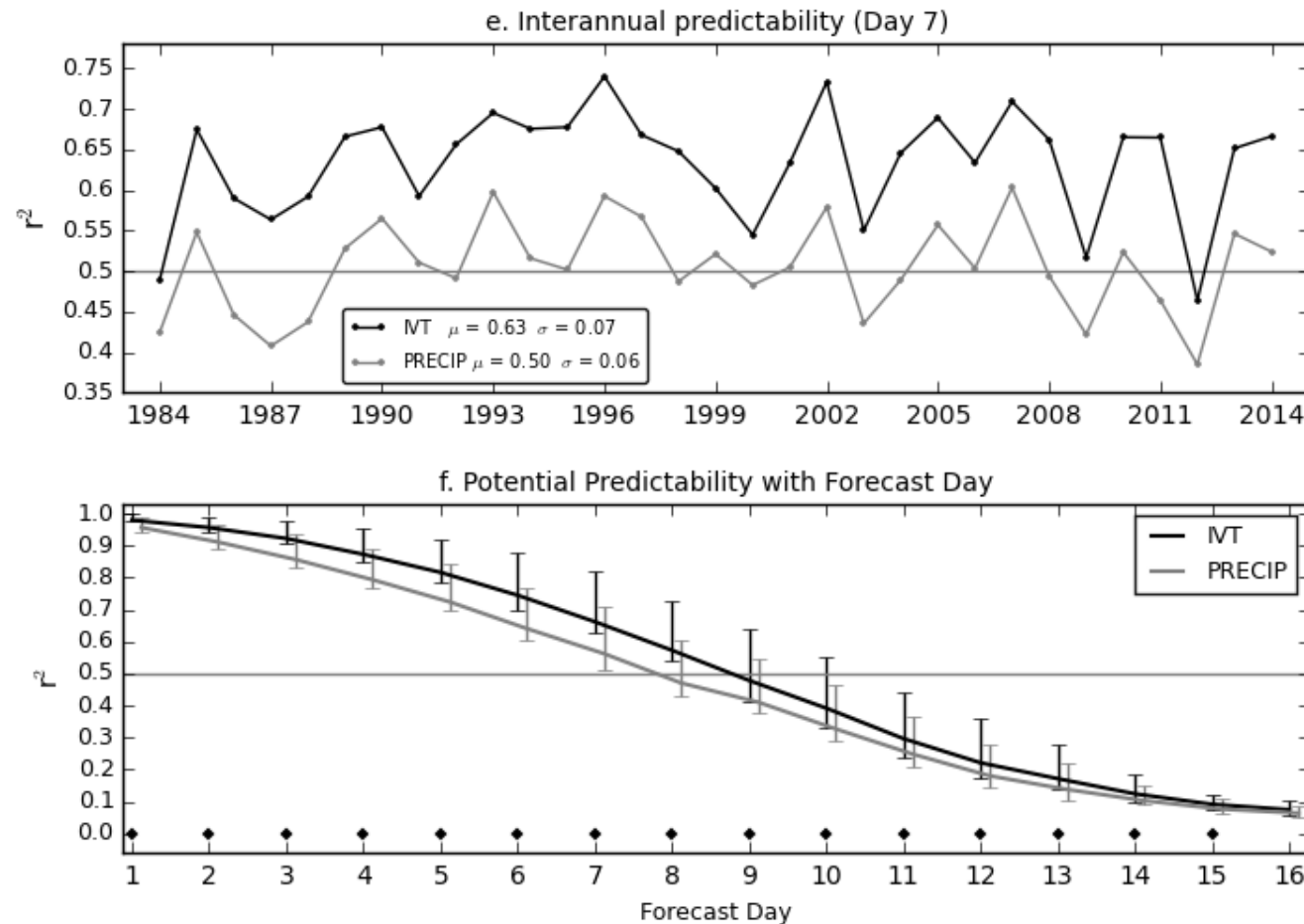
*Slide courtesy of F.M. Ralph, Scripps/CW3E*



Used 32 km gridded QPE and QPF from NCEP/WPC from 2007-2011. For 1-day lead time. Note QPF for Western RFC's and New England are best.

# Predictability of horizontal water vapor transport relative to precipitation

Applying the potential predictability concept to the NCEP global ensemble reforecasts, across 31 winters, IVT is found to be more predictable than precipitation.



Courtesy of Lavers, Waliser,  
Ralph, Dettinger  
GRL 2015

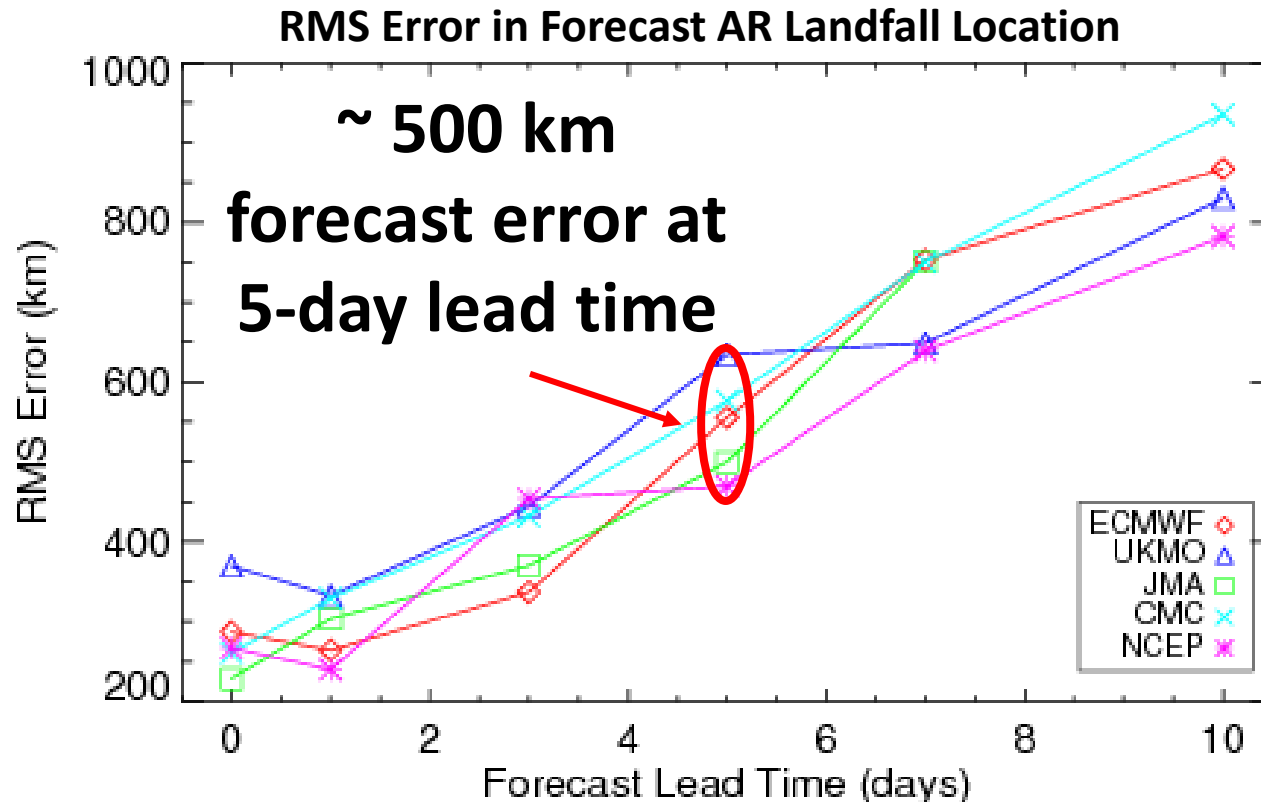


Center for Western Weather  
and Water Extremes



# AR Landfall Position Forecast Errors Quantified

While overall occurrence well forecast out to 10 days, landfall is less well predicted and the location is subject to significant errors, especially at longer lead times



- Errors in location increase to over 800 km at 10-day lead
- Errors in 3-5 day forecasts comparable with current hurricane track errors
- Model resolution a key factor

*From Wick et al., 2013 (Weather and Forecasting)*

- Models provide useful heads-up for AR impact and IWV content, but location highly uncertain
- Location uncertainty highlights limitations in ability to predict extreme precipitation and flooding
- Improvements in predictions clearly desirable

# Atmospheric River Forecast Example

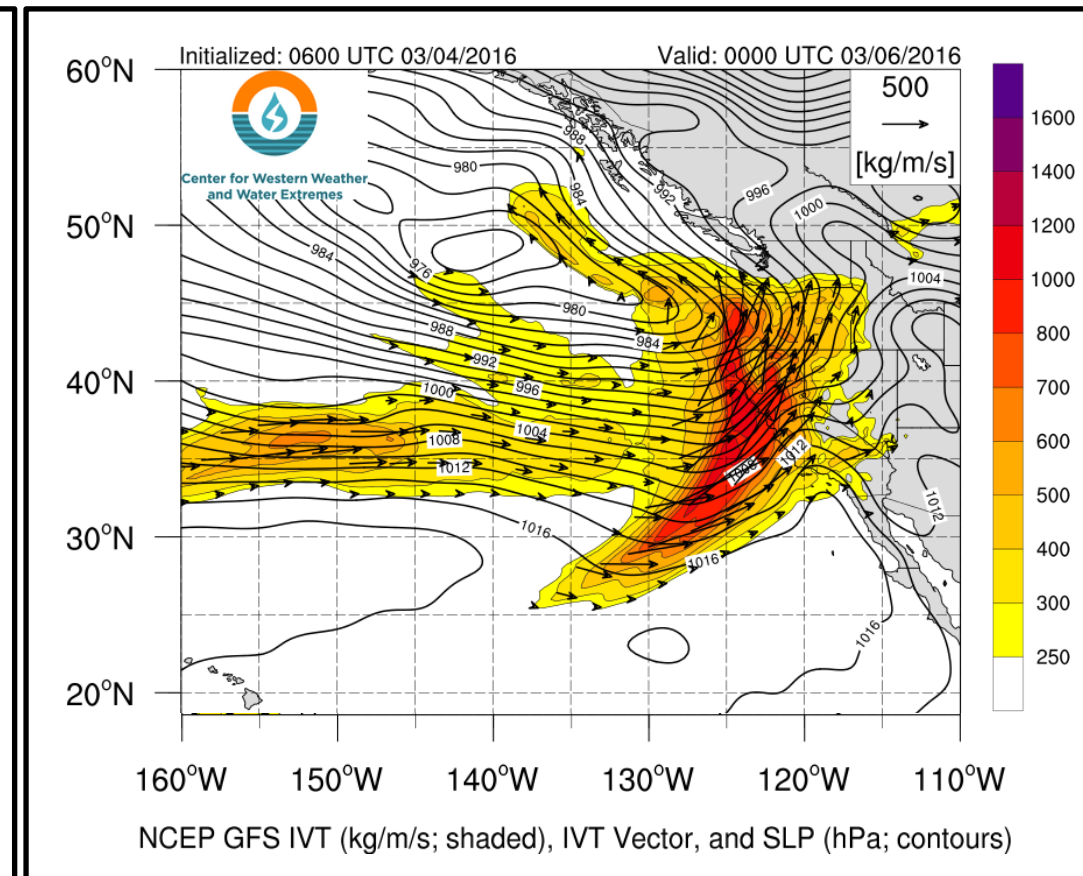
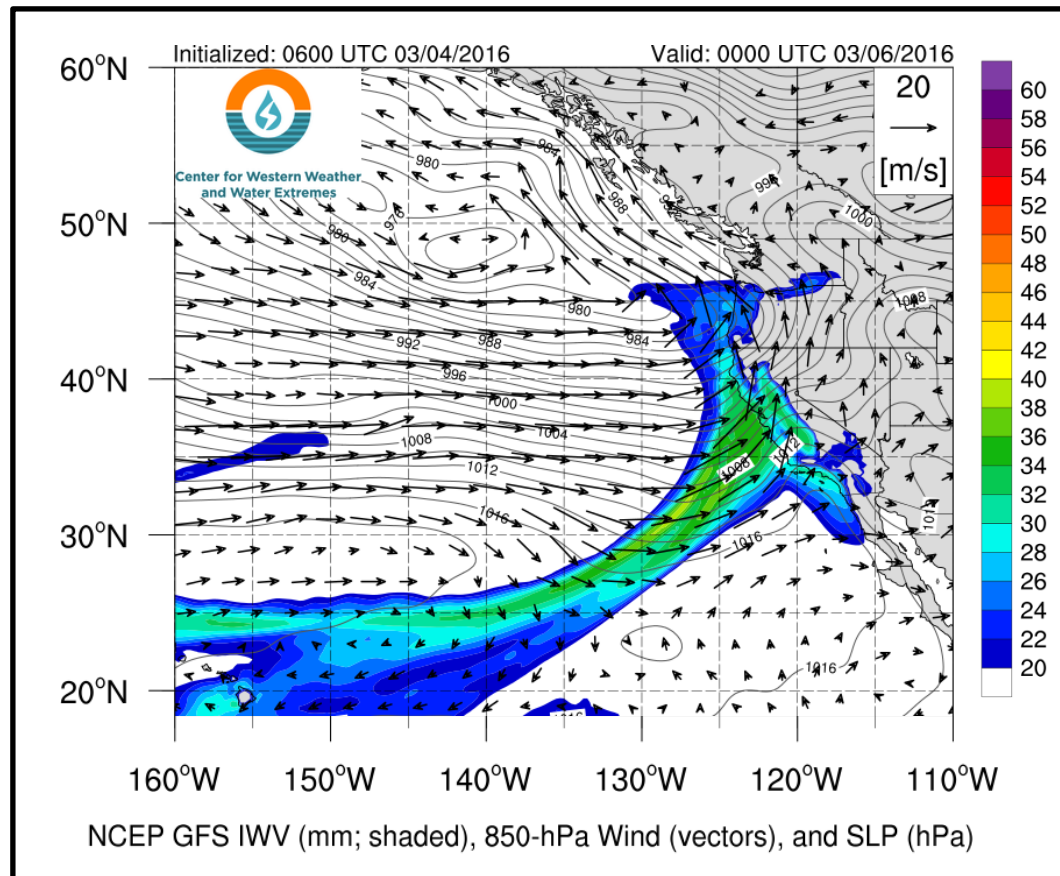


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and Water Extremes

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Incoming storm of 5-7 March 2016 has characteristics of an atmospheric river

- Strikes mostly northern and central California
- Moderate strength
- Average duration at landfall (12-24 hours)

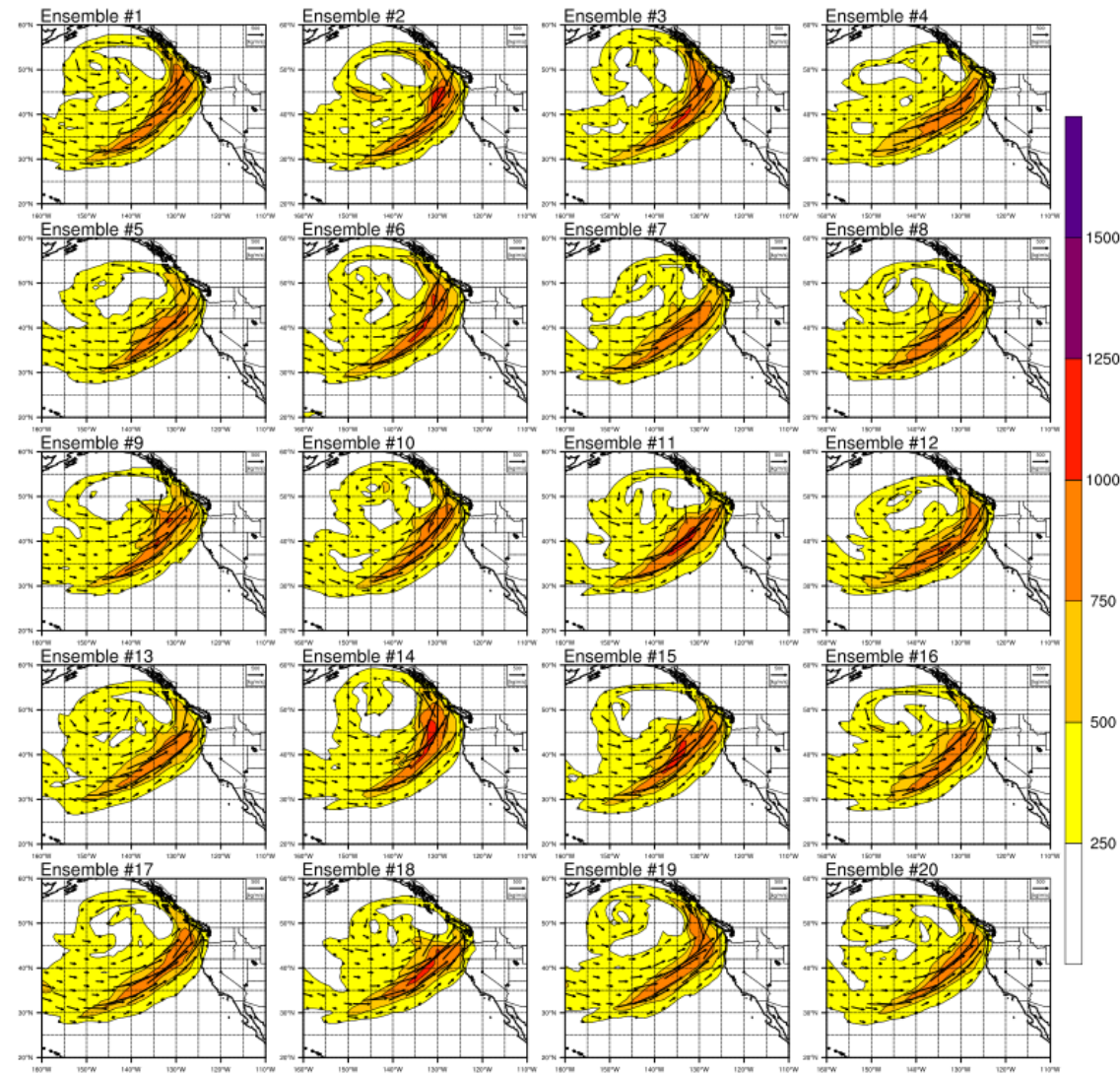


Summary by F.M. Ralph 8 AM PT Fri 4 March 2016

# “Ensemble” prediction of ARs

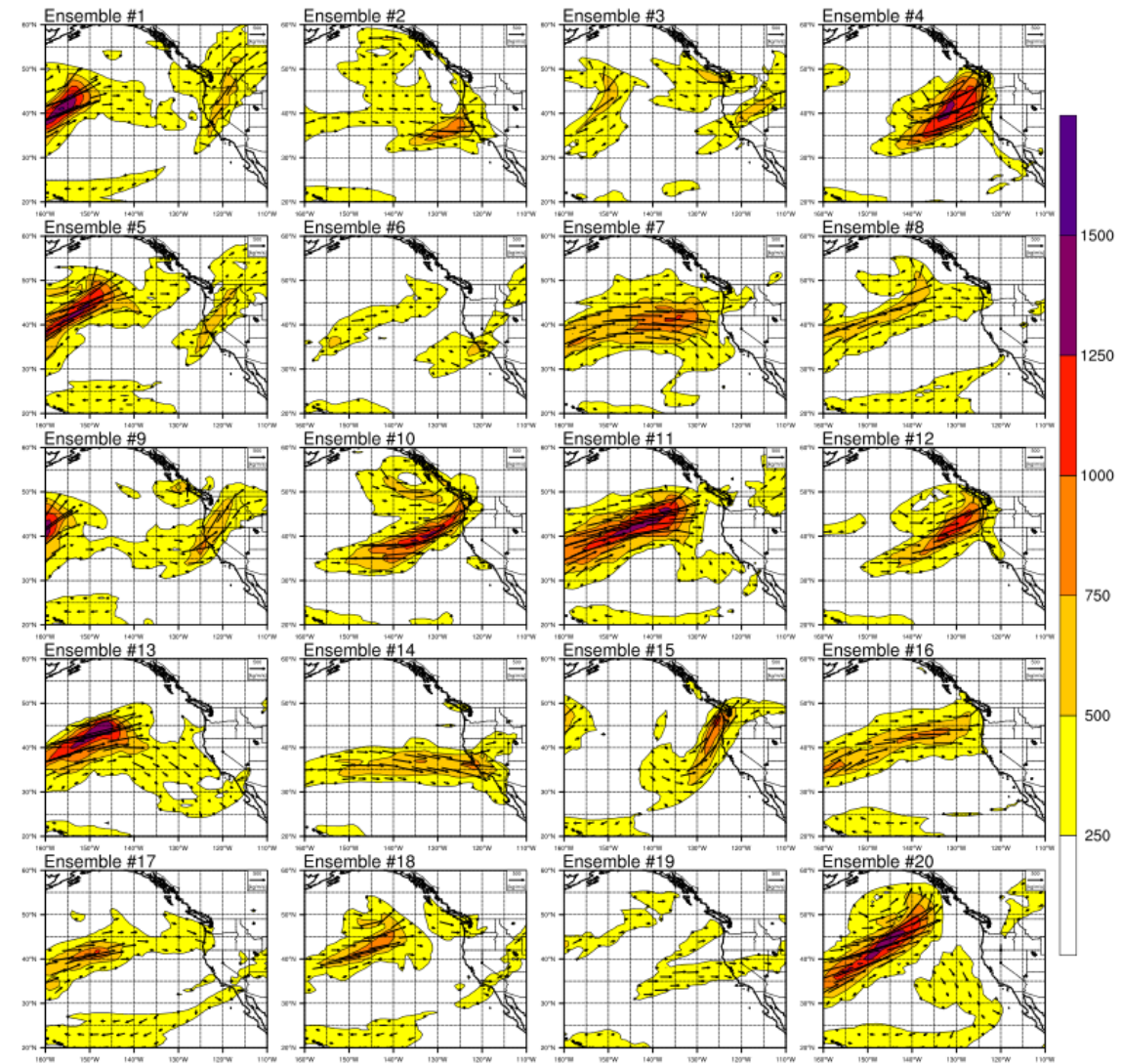
3-days lead time

GFS Ensemble IVT (kg/m/s) valid 12Z Sat 12/05/15 | F+72h



8-days lead time

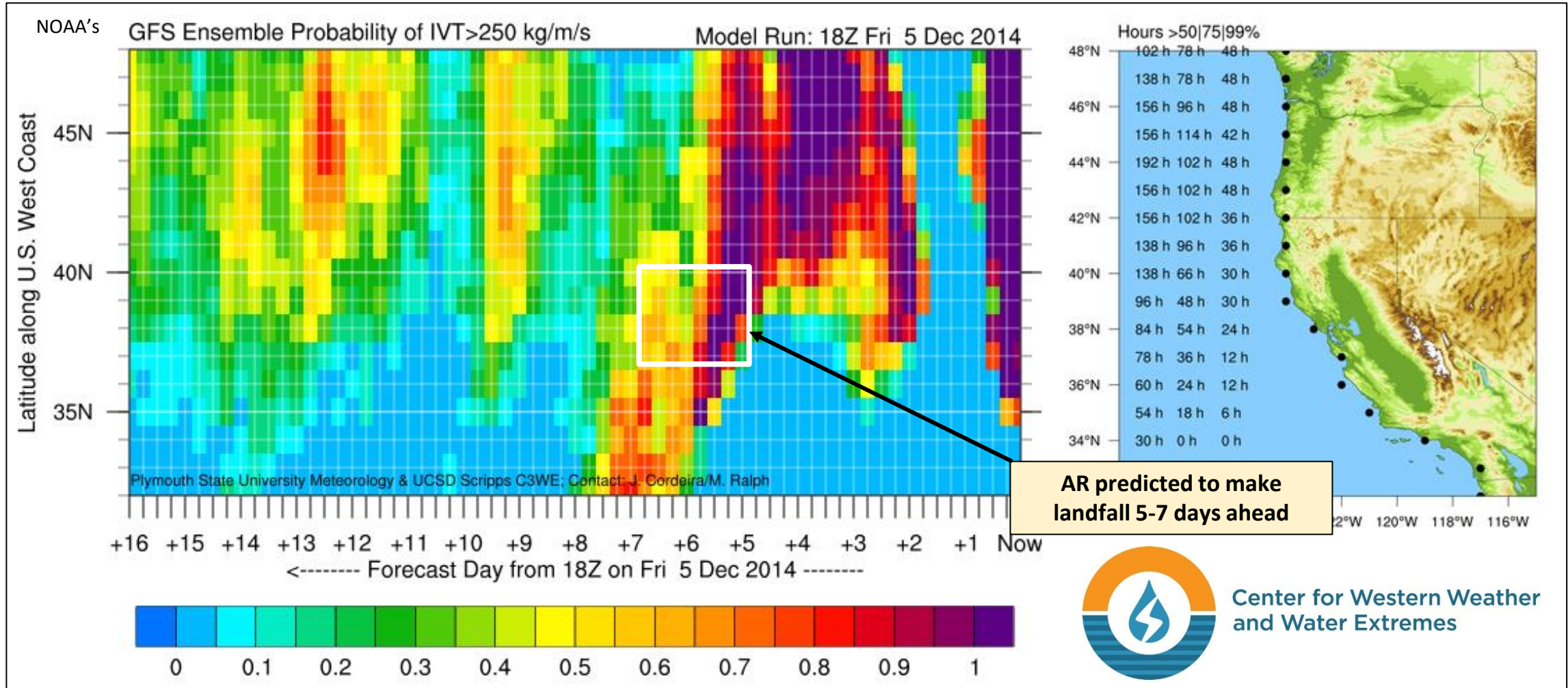
GFS Ensemble IVT (kg/m/s) valid 12Z Thu 12/10/15 | F+192h



# Example of a new AR Forecast Tool: Dec 2014

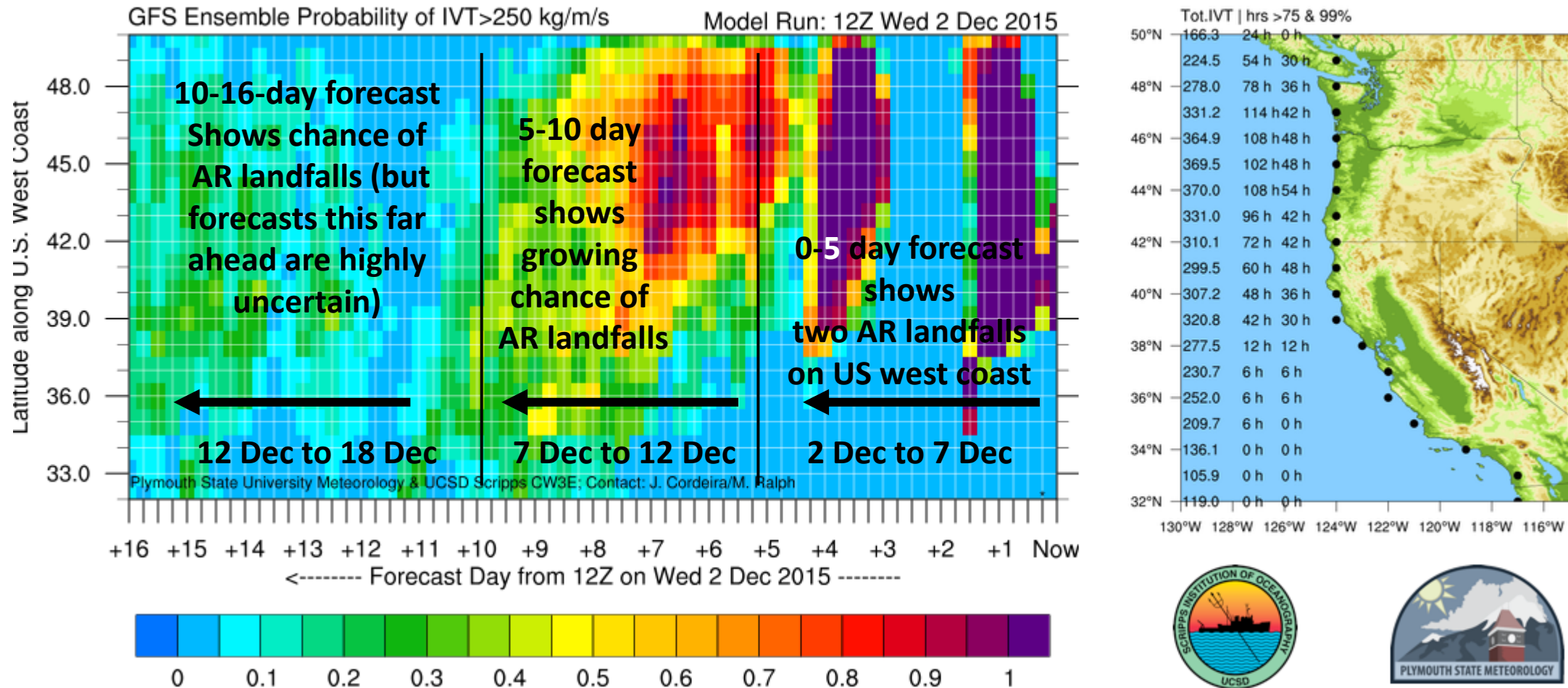
From J. Cordeira of Plymouth State Univ. and Scripps/CW3E

Available real-time at [cw3e.ucsd.edu](http://cw3e.ucsd.edu)



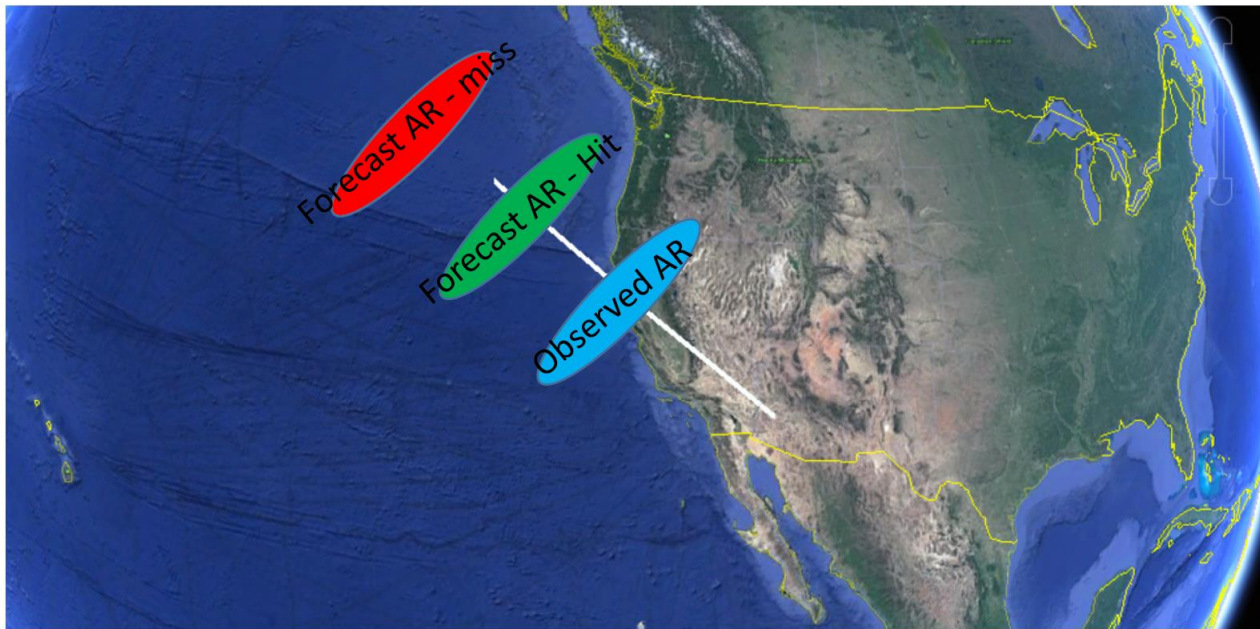
# Weekly Lead-times

Forecast chances of landfall of at least WEAK Atmospheric River conditions on the U.S. West Coast from 2-18 Dec 2015 - updates available at [cw3e.ucsd.edu](http://cw3e.ucsd.edu) (Cordeira et al. BAMS 2016, in press)



This AR Landfall probability tool is from a partnership between Plymouth State Univ. (Cordeira) and CW3E (Ralph and Kawzenuk)

"1000km" AR hit threshold



**Encouragingly, there is some skill in predicting atmospheric rivers a week ahead in west coast's wettest season (Dec-Feb)**

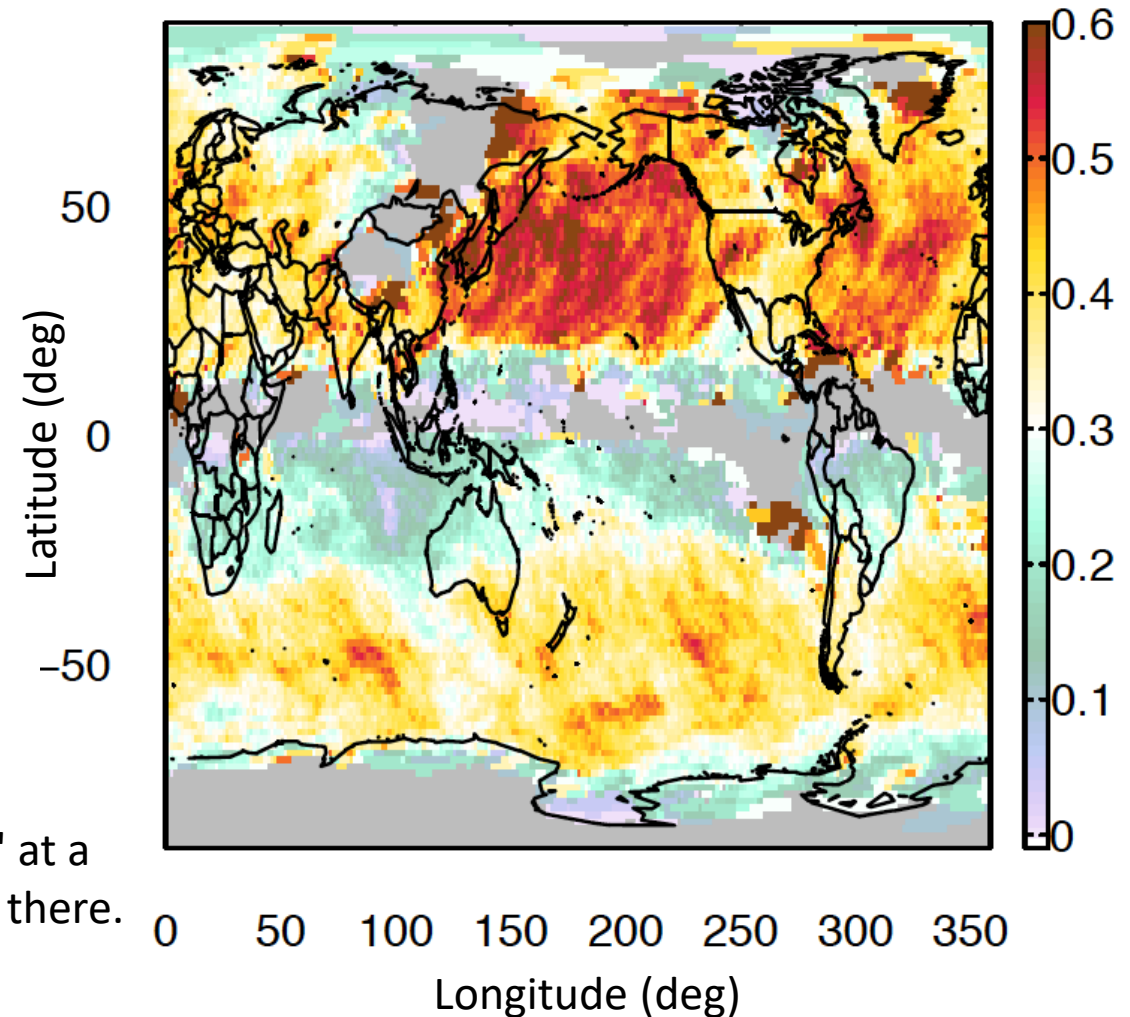


The shading represents the average fraction of ECMWF ensemble members that record a "hit" at a given grid cell when an observed AR is present there.

Orange and red areas have some skill with 1-week lead time in predicting the presence of an AR within 1000 km of that location.

## Preliminary results from DeFlorio, Guan and Waliser

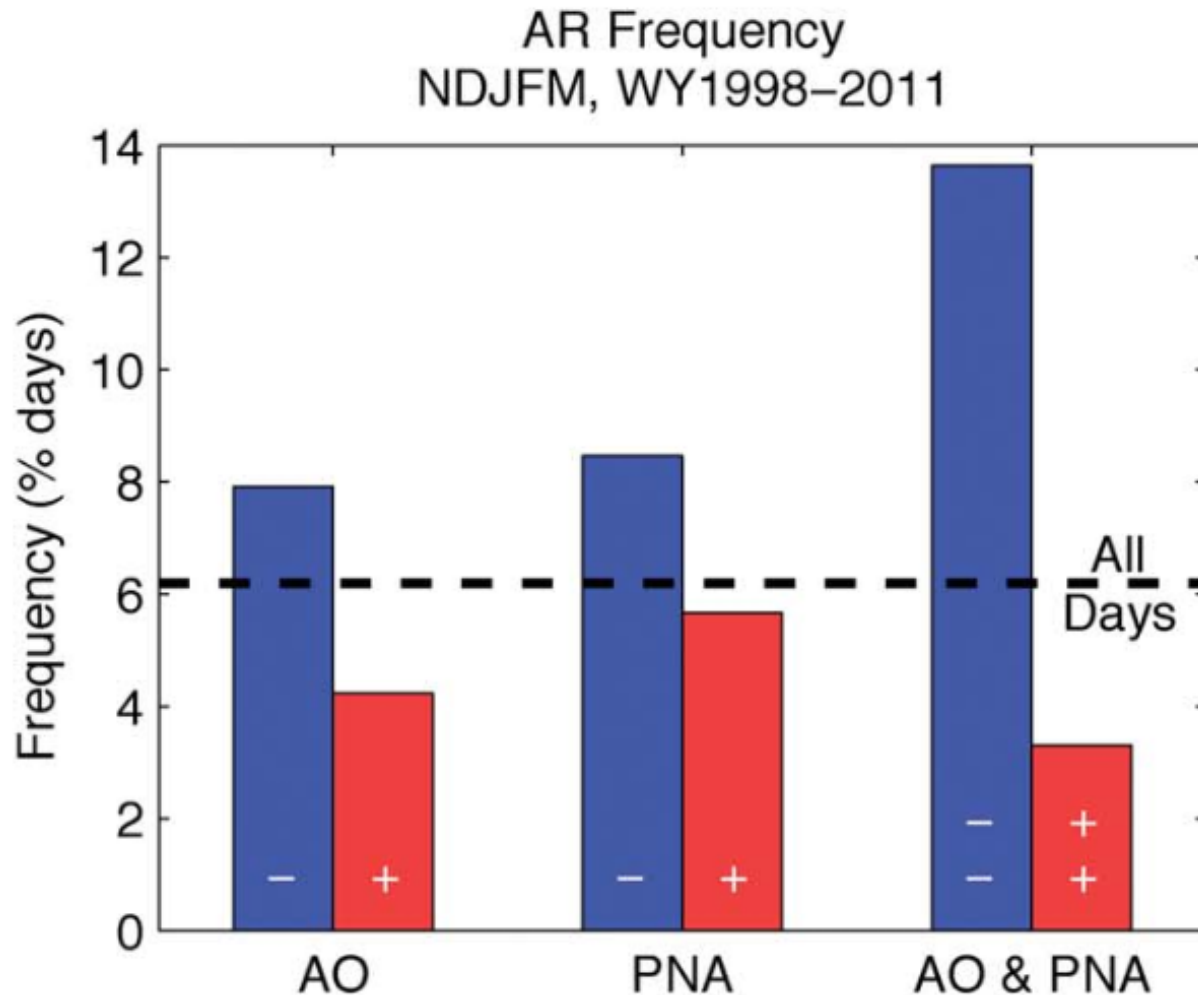
**December through February**



ECMWF 1996–2013 prediction skill, 1wk lead (1000km thresh)

# The 2010/2011 snow season in California's Sierra Nevada: Role of atmospheric rivers and modes of large-scale variability

Guan, B., N.P. Molotch, D. E. Waliser, E. Fetzer and P.J. Neiman  
*Water Resources Research* (2013)



Arctic Oscillation (negative , i.e., southward cold-air outbreaks) combined with Pacific North American “teleconnections” pattern (negative, southern storm track). Favors Atmospheric river conditions striking the Sierra and causing precipitation

# Canonical Correlation Analysis

## CCA Predictability: JFM, 1950-2013

Predictor: JFM SST

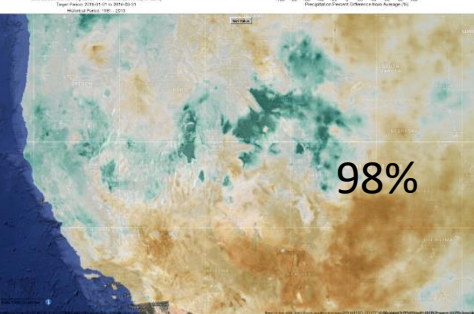
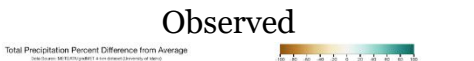
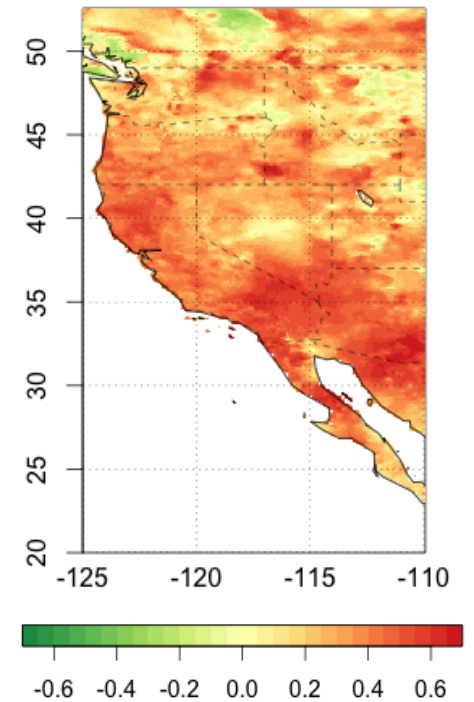
Cross-validated skill: correlations of predicted vs. observed JFM precipitation

Predictand:

JFM totPRCP anomaly %

Skill: PCs = 8, CCs = 8

Gershunov and Cayan, *J. Clim.* (2004)



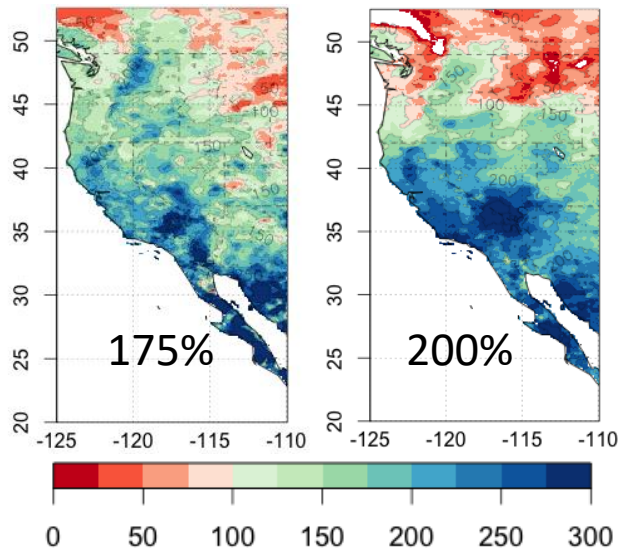
Slide courtesy of  
A. Gershunov and  
T. Shulgina, CW3E

## CCA Prediction Model: PRCP anomaly, JFM, 1983/1998/2016

All PRCP anomaly (%), JFM 1983

Observed

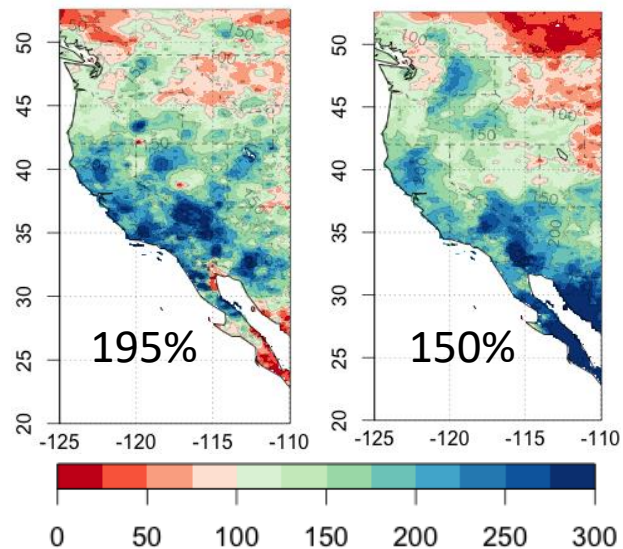
Predicted



All PRCP anomaly (%), JFM 1998

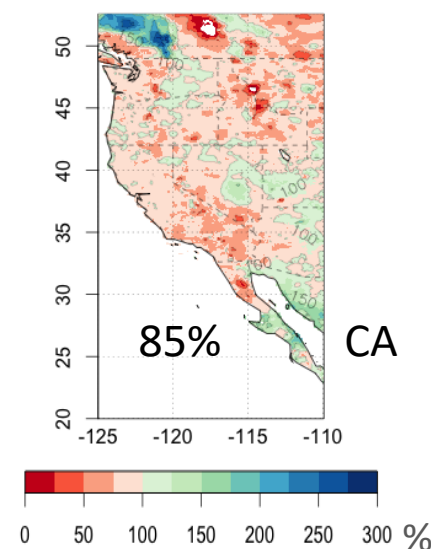
Observed

Predicted



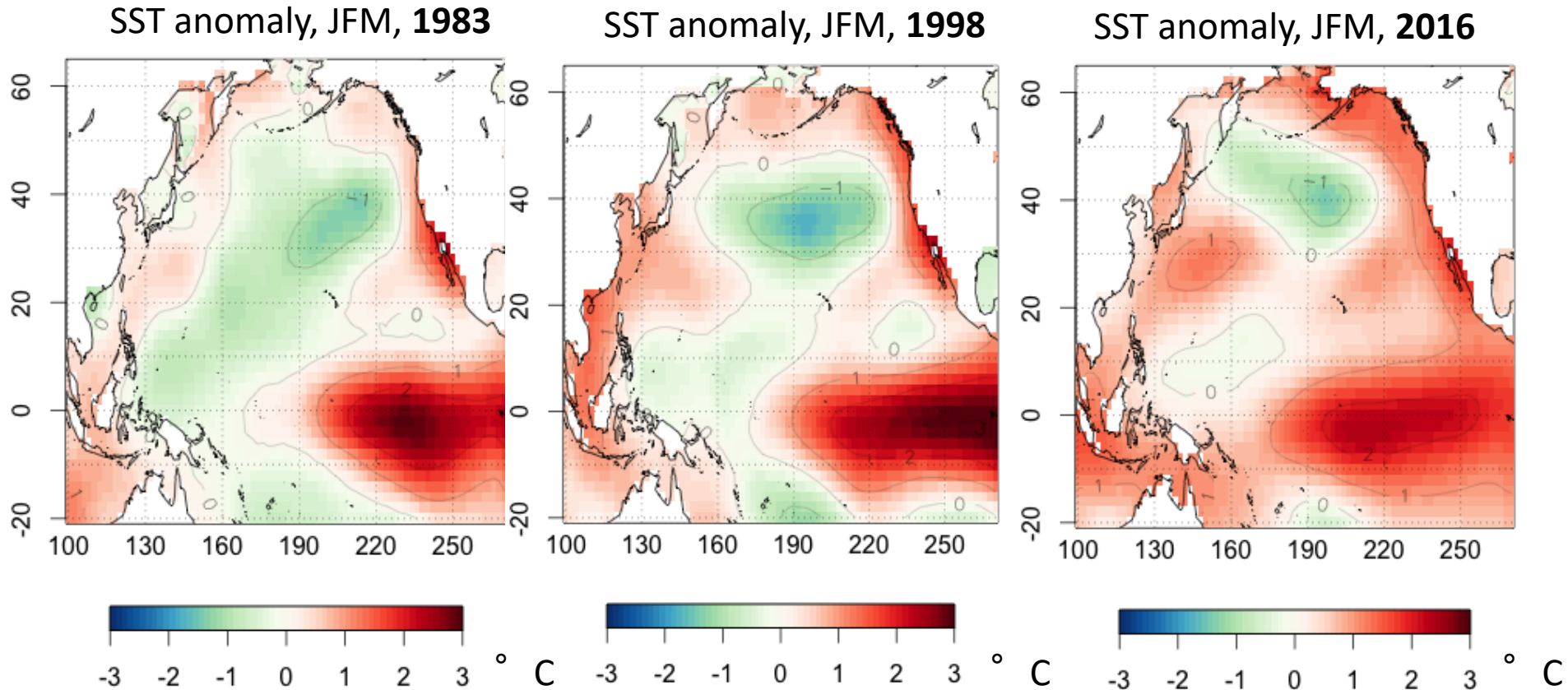
All PRCP anomaly (%), JFM 2016

Predicted



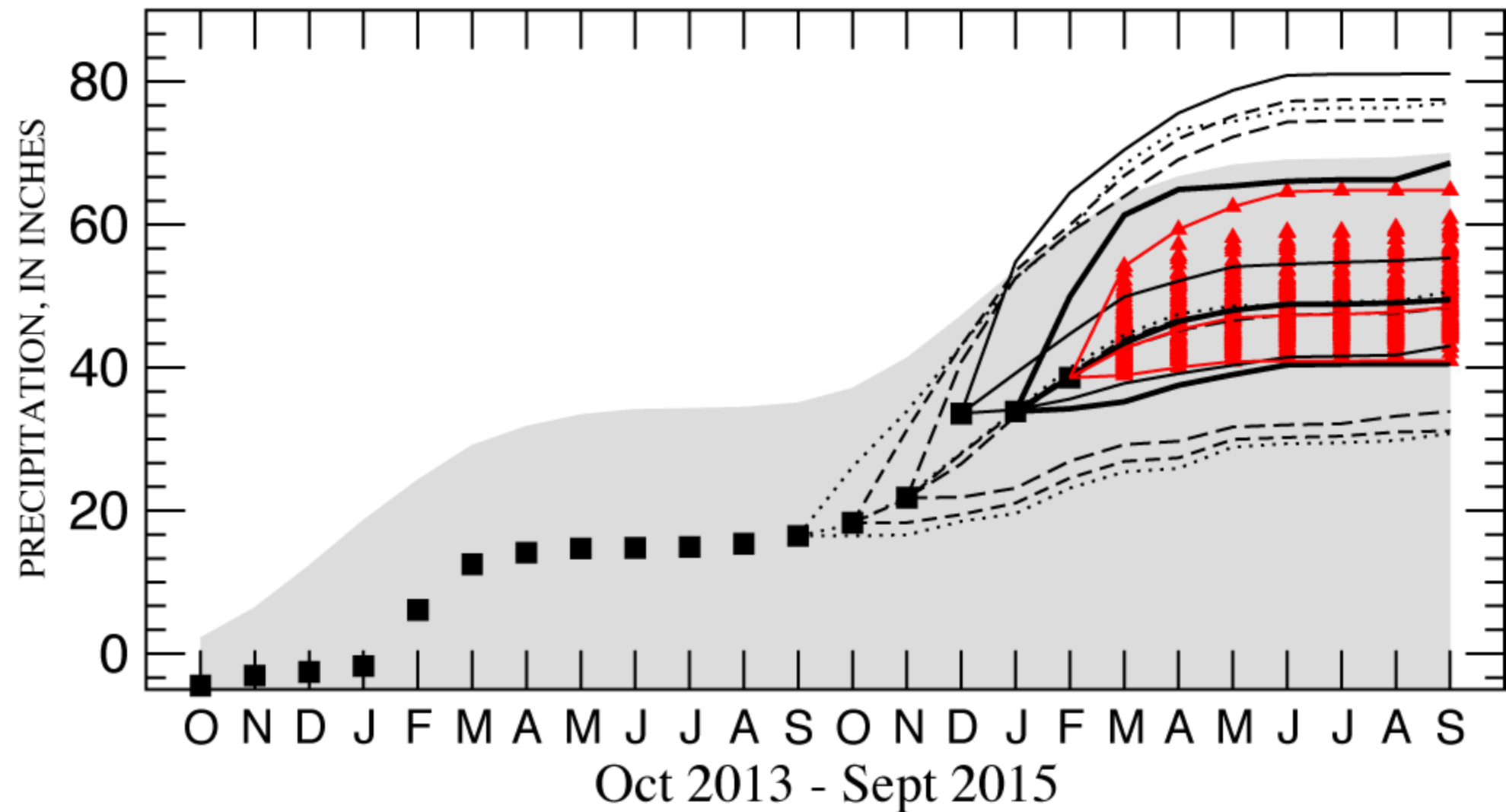
CA

# CCA Prediction Model – SST differences



Slide courtesy of  
A. Gershunov and T. Shulgina, CW3E

# California Sacramento Drainage



*Courtesy of Mike Dettinger*



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AT UC SAN DIEGO

# CW3E Post-Event Summary 21-22 September 2016

Brian Kawzenuk, Meredith Fish, F. Martin Ralph, Brian Henn



# Discussion

- Former Hurricane Paine moved North off the Baja California coast prior to making landfall as a Post-Tropical Depression over central Baja California
- Paine was considered a hurricane for <24 hours (Sep 19) with maximum sustained winds >90 mph
- Despite being dissipating prior to landfall moisture in advance of Paine moved inland over the Southwestern U.S. and produced heavy precipitation in California, Arizona, Utah, and Nevada
- Moisture from Paine interacted with a weak mid-latitude cyclone over UT and produced heavy precipitation and thunderstorms

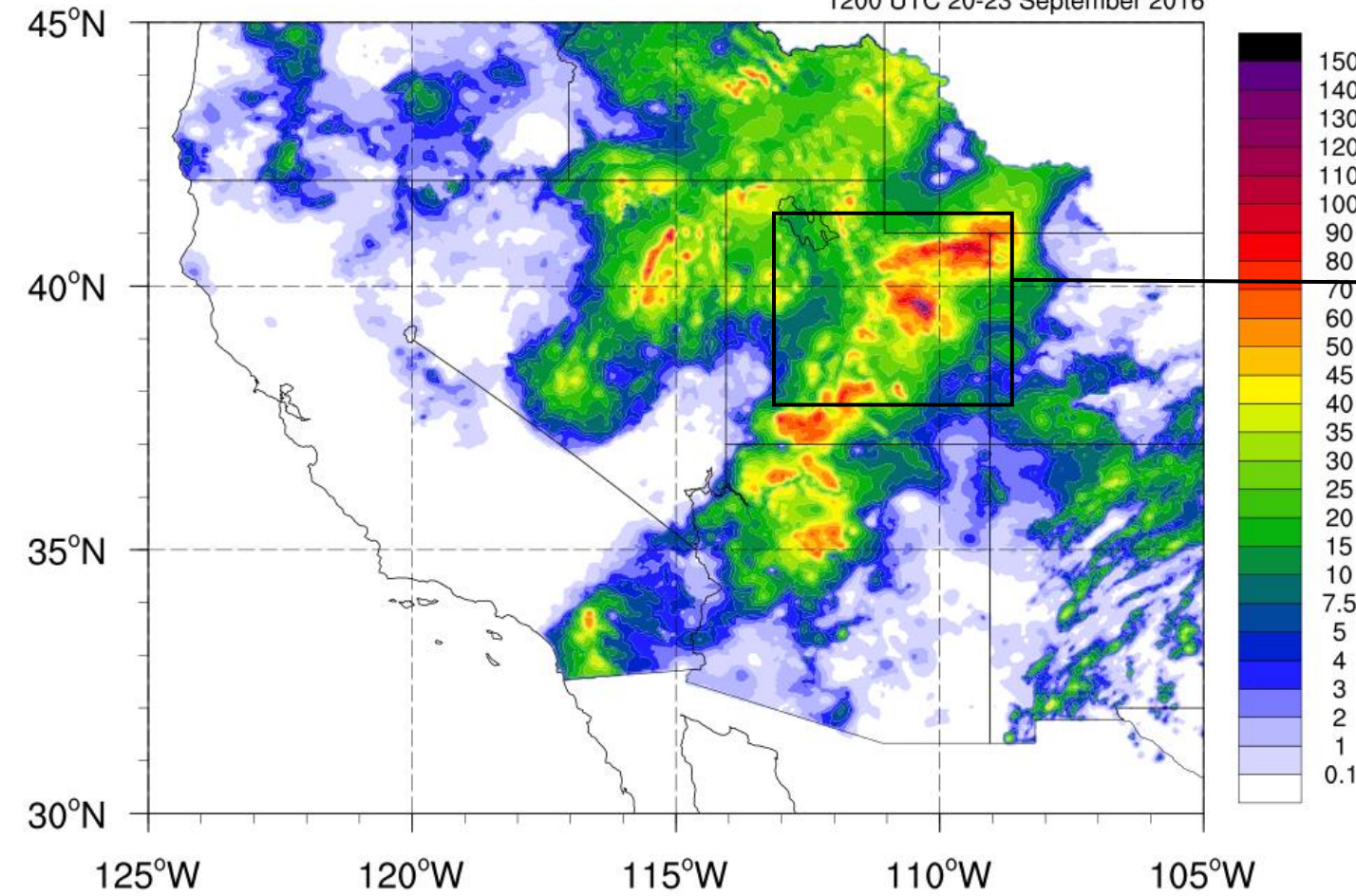
MODIS (Moderate Resolution Imaging Spectroradiometer) true-color during 17-24 Sep 2016



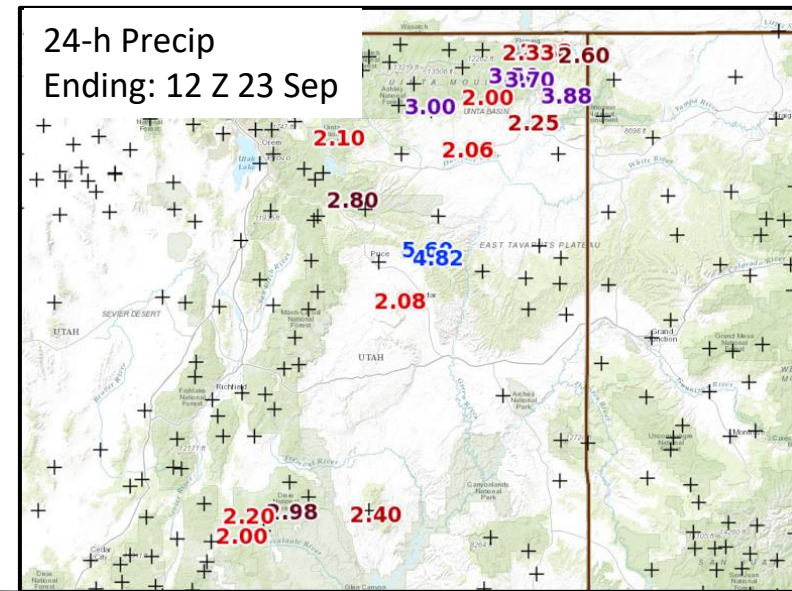
# Gridded Precipitation

72-h Accumulated Precipitation (mm)

1200 UTC 20-23 September 2016



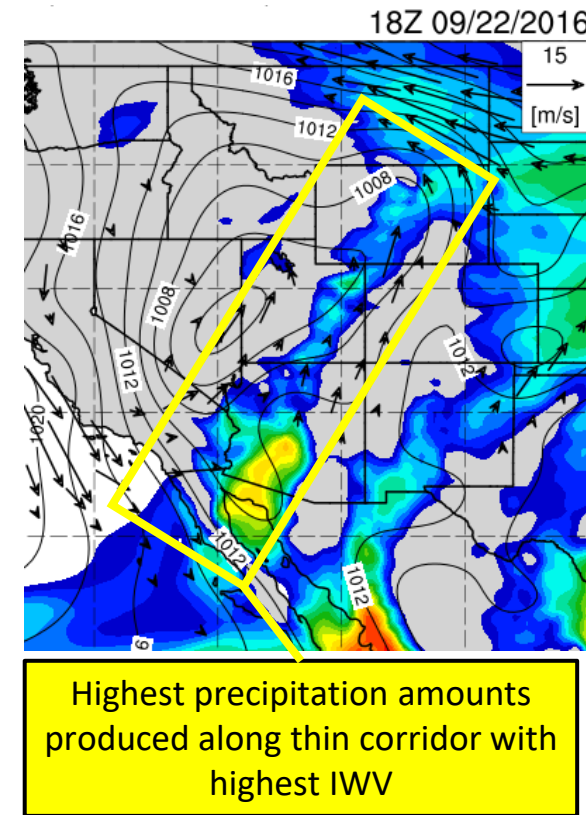
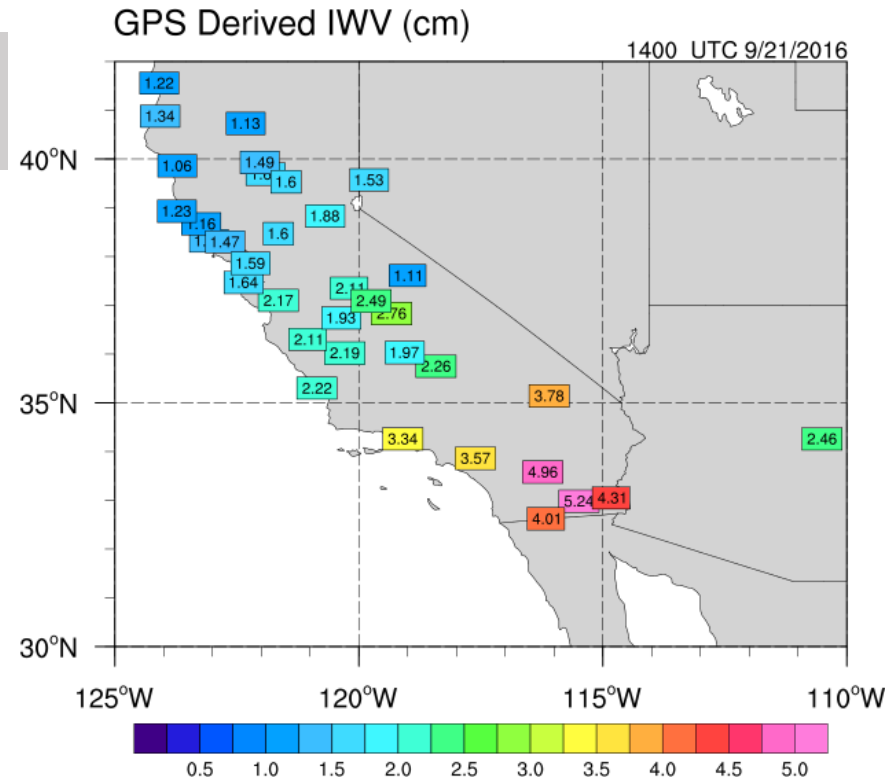
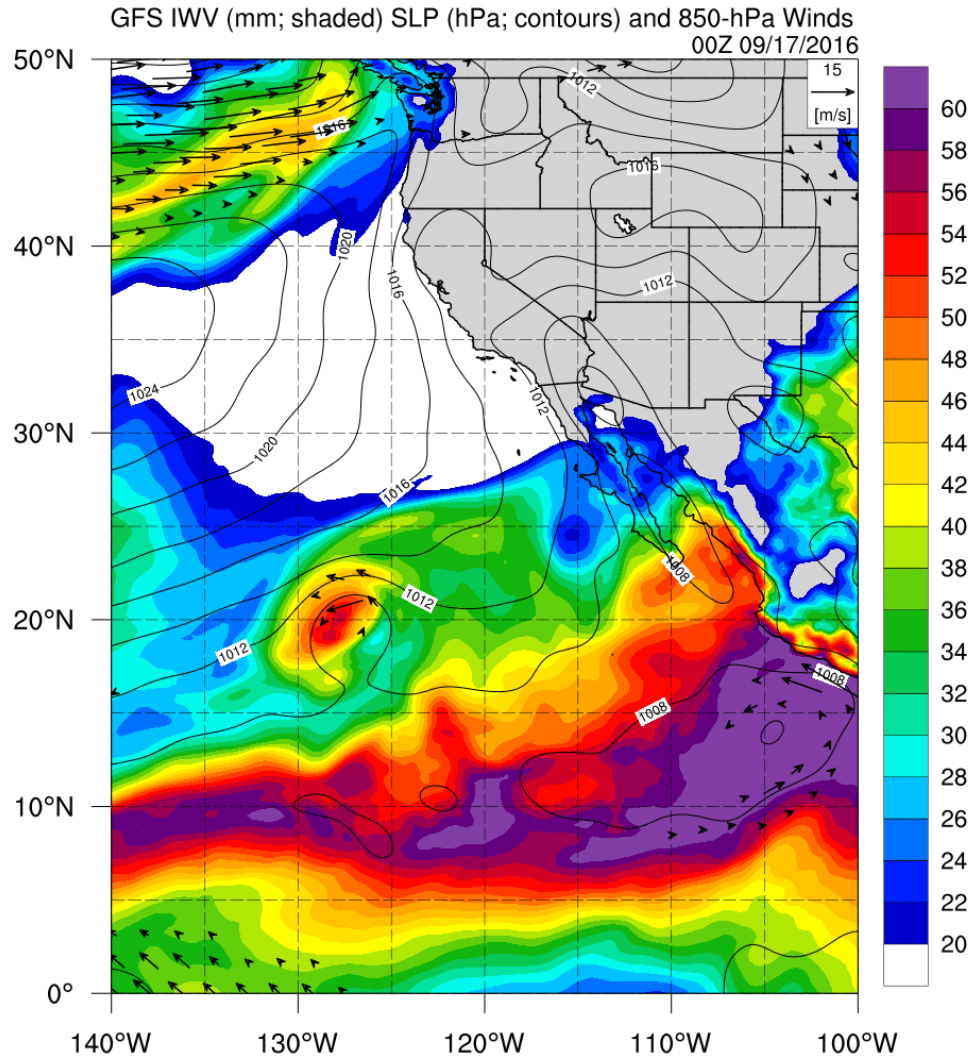
24-h Precip  
Ending: 12 Z 23 Sep



- Stage IV precipitation data shows up to 150 mm (~6 in.) of 72-hr accumulated precipitation occurred over the Southwestern U.S.
- Several individual rain gauges in Arizona and Utah showed > 5 in. of precipitation



# Integrated Water Vapor

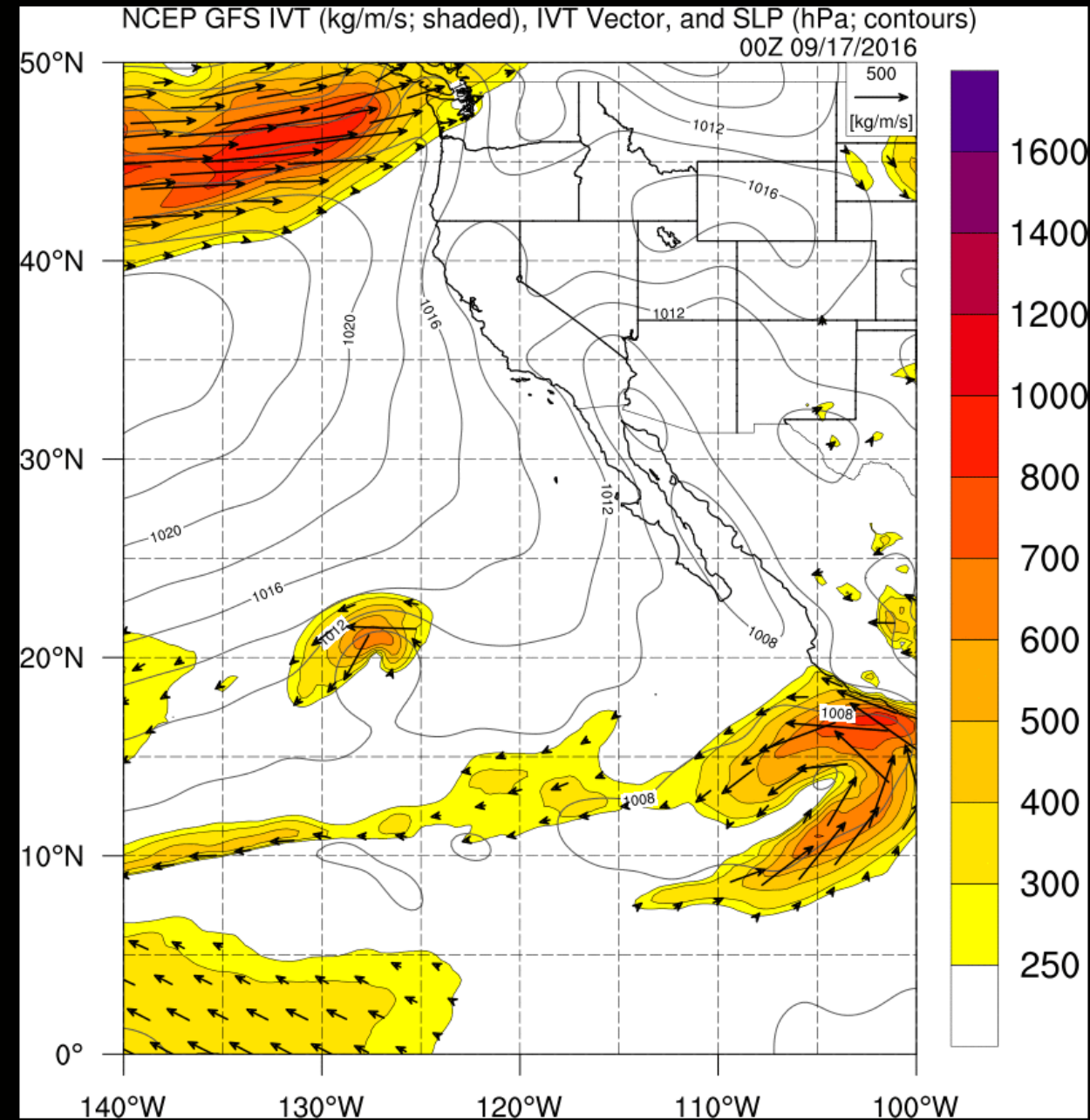


- Integrated water vapor (IWV) >5 cm associated with former Hurricane Paine moved inland over California and Arizona
- The moisture originated and was transported out of the tropics to the mid-latitudes



# Integrated Vapor Transport

- Due to high moisture content and high winds Hurricane Paine had high values of integrated vapor transport ( $>1600 \text{ kg m}^{-1} \text{ s}^{-1}$ )
- $\text{IVT} > 500 \text{ kg m}^{-1} \text{ s}^{-1}$  penetrated inland over the southwestern U.S.
- IVT was oriented from the south and moved through the Colorado River lowlands inland
- This system produced Atmospheric River Conditions ( $\text{IWV} > 20 \text{ mm}$  and  $\text{IVT} > 250 \text{ kg m}^{-1} \text{ s}^{-1}$ ) over most of SW U.S., however, this is not considered an AR as it was not a long, filament-like structure.



— IT'S LANDED! —  
**THE FIRST SNOW**  
OF THE SEASON



9.24.16

Steamboat CO 24 Sept 2016



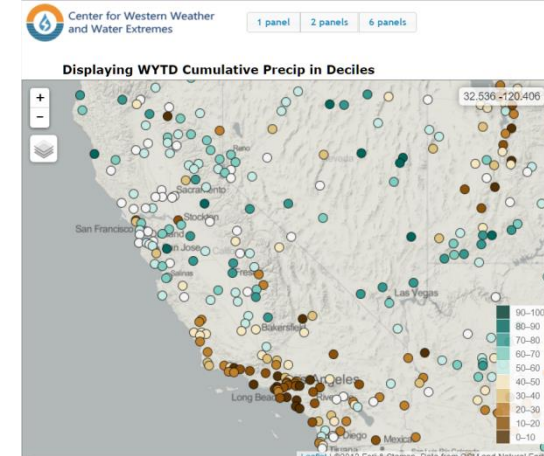
**CW3E**

Available at  
CW3E.UCSD.EDU

## 1. Accumulated precip so far this water year, at *stations*

- Long time series high quality GHCN stations
- Also shows El Nino/La Nina response at stations
- Scroll/pan/zoom map with station results

<http://cirrus.ucsd.edu/~pierce/staweb/>



## 2. *Regional* WYTD accum precip in historical context

- Plus 1-, 2-, and 3-day changes, in context
- All CA, plus selected regions
- (8-station index, LA basin, etc.)

<http://cirrus.ucsd.edu/~pierce/sdprecip/>

Northern Sierra Nevada 8-Station Index ([station list](#); a traditional indicator of CA water supply)

| Current:  | 109.5%       | 1-day Δ:  | 0.00%        | 2-day Δ:  | 0.00%        | 3-day Δ:  | 0.00%        |
|-----------|--------------|-----------|--------------|-----------|--------------|-----------|--------------|
|           | (1977/09/26) |           |              |           |              |           |              |
| Rec_low:  | 35.5%        | 50-ptile: | 0.10%        | 50-ptile: | 0.14%        | 50-ptile: | 0.18%        |
| Typ_low:  | 69.8%        | 90-ptile: | 1.31%        | 90-ptile: | 1.92%        | 90-ptile: | 2.44%        |
| Mean:     | 100.0%       | 95-ptile: | 2.18%        | 95-ptile: | 3.27%        | 95-ptile: | 4.07%        |
| Typ_high: | 134.4%       | 99-ptile: | 4.01%        | 99-ptile: | 6.00%        | 99-ptile: | 7.43%        |
| Rec_high: | 172.7%       | Record:   | 11.48%       | Record:   | 20.55%       | Record:   | 25.56%       |
|           | (1983/09/26) |           | (1962/10/12) |           | (1962/10/13) |           | (1962/10/14) |

## 3. R-CAT (Rainfall-category) heavy rain alerts

- Automated email service
- Alert sent if R-cat event (>200 mm in past 3 days)
- Based on Ralph and Dettinger (2011, BAMS)
- Uses the same thresholds everywhere for 3-day totals
- R-CAT level 3 & 4 events are as uncommon as EF 4-5 tornadoes or CAT 3-5 landfalling Atlantic hurricanes
- Email shows map of location and amount

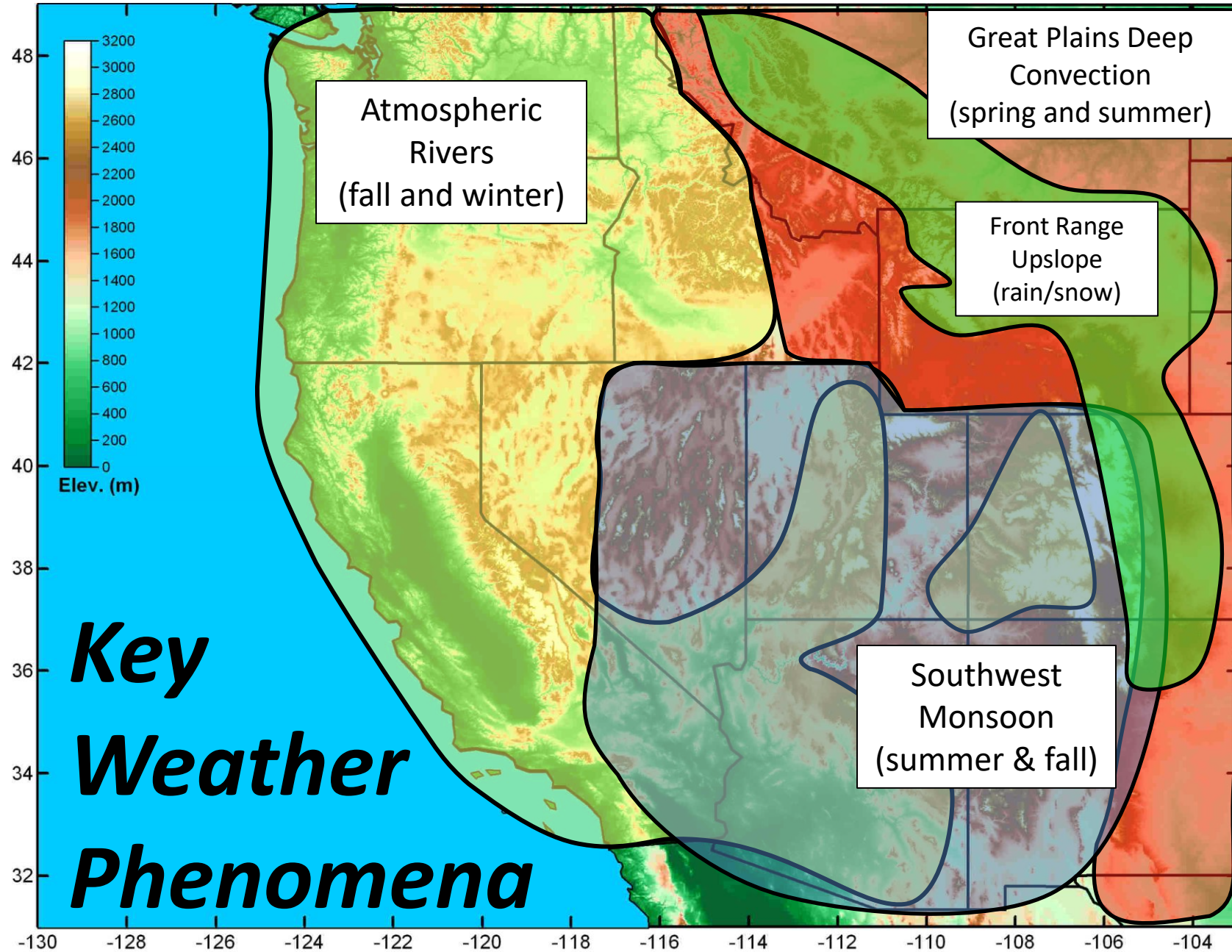


Email with subject "subscribe" to [rcatalert@cirrus.ucsd.edu](mailto:rcatalert@cirrus.ucsd.edu)



**Thank  
you!**

Schematic illustration of regional variations in the primary weather phenomena that lead to extreme precipitation, flooding and contribute to water supply in the Western U.S. (Ralph et al. 2014)



# C-130 Atmospheric River Reconnaissance in February 2016

## A joint effort of Scripps/CW3E, NOAA/NWS, Air Force

FM Ralph (Lead; Scripps Inst. Of Oceanography)  
M. Silah (NOAA/NWS)  
J. Doyle (Navy/NRL)  
J. Talbot (U.S. Air Force)

C-130  
C-130  
C-130

Landfall of AR caused heavy rain and high river flows in WA state

Observed IWV from SSM/I  
Satellite passes from 13 Z 13 – 01 Z 14 Feb  
Showing atmospheric river signature  
Satellite image from NOAA/ESRL/PSD

## 1st C-130 AR Recon Mission 13-14 Feb 2016

Dropsondes released for the  
0000 UTC 14 Feb 2016  
GFS data assimilation window

14 Feb 2016

- ▲ NOAA9
- ▲ NA872
- ▲ AF302
- ▲ AF309
- ▲ Other

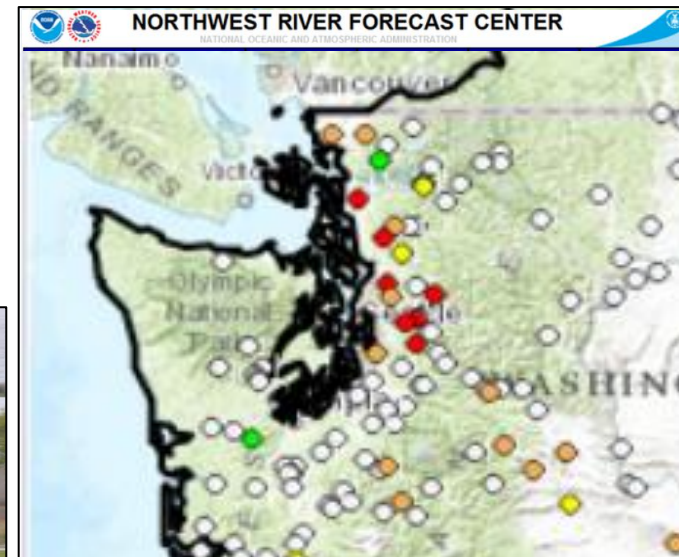
Locations of C-130 AR Recon  
dropsondes received and  
successfully decoded into NCEP's  
production bufr data tanks for  
assimilation into NCEP/GFS



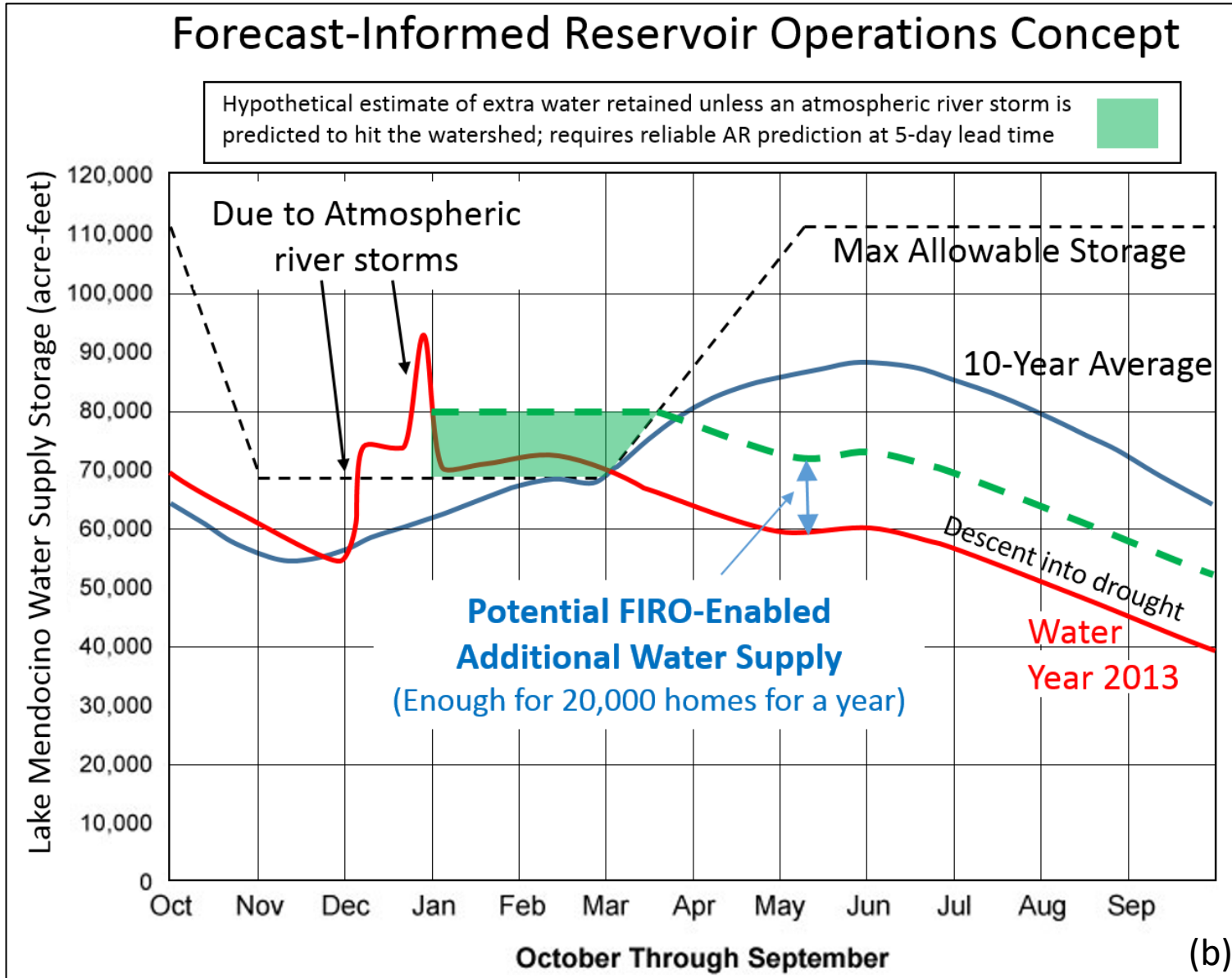
Air Force C-130 Aircraft – Weather Recon' Squadron



Center for Western Weather  
and Water Extremes

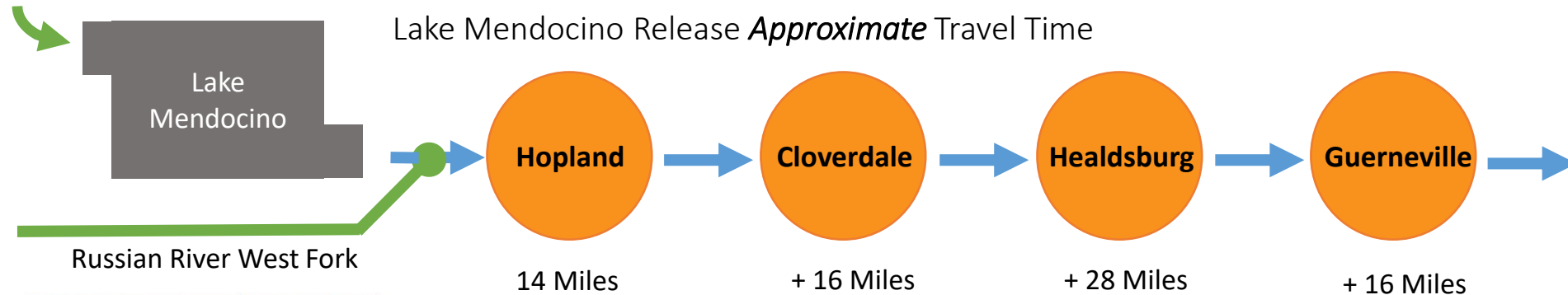


NWRFC flood forecast map as  
of 1500 UTC 15 Feb showing  
several rivers predicted to  
reach flood stage on 15-16  
Feb (red dots)



# How much forecast lead time is required to enable FIRO on Lake Mendocino?

10,000 AF could be released at 2500 cfs, which would take **2 days**



Total travel time ranges from 26hrs to 85hrs depending on flow rate (74miles traveled)\*

**Bottom Line:** It takes 2 days to release 10,000 AF at 2500 cfs, plus 1.1 to 3.5 days for water released from Lake Mendocino to get past vulnerable communities downstream. In situations this would be needed, travel times will be on the short end of range.

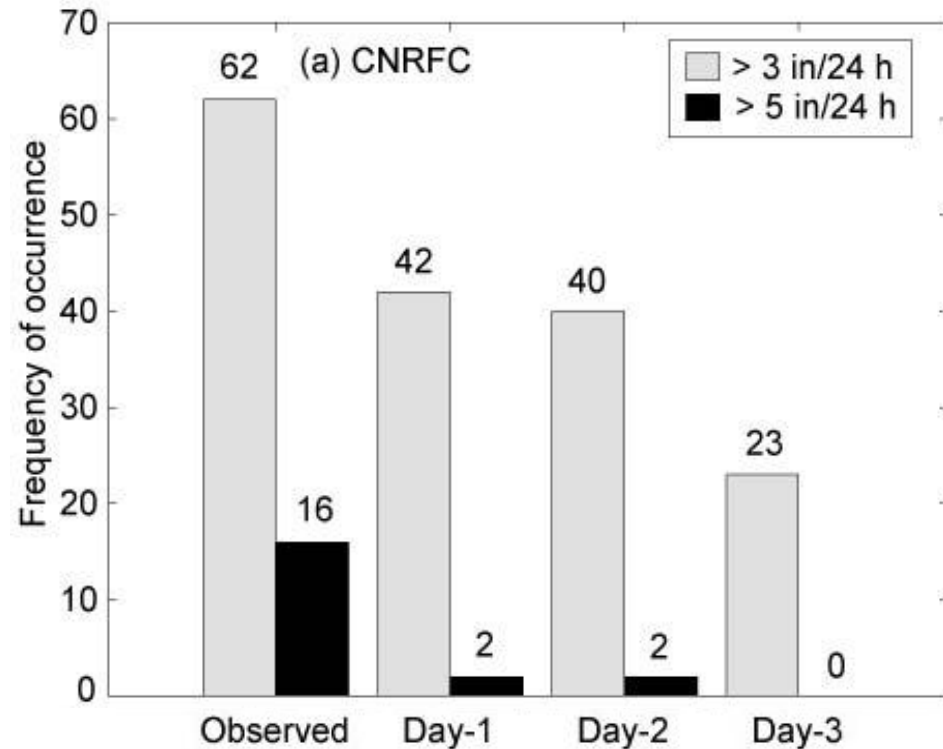
**- This sets a forecast lead time requirement of 3-5 days to predict landfalling atmospheric rivers.**



\*Uses information from Coyote Valley Dam and Lake Mendocino Water Control Manual (1986)

# The Forecasting Challenge

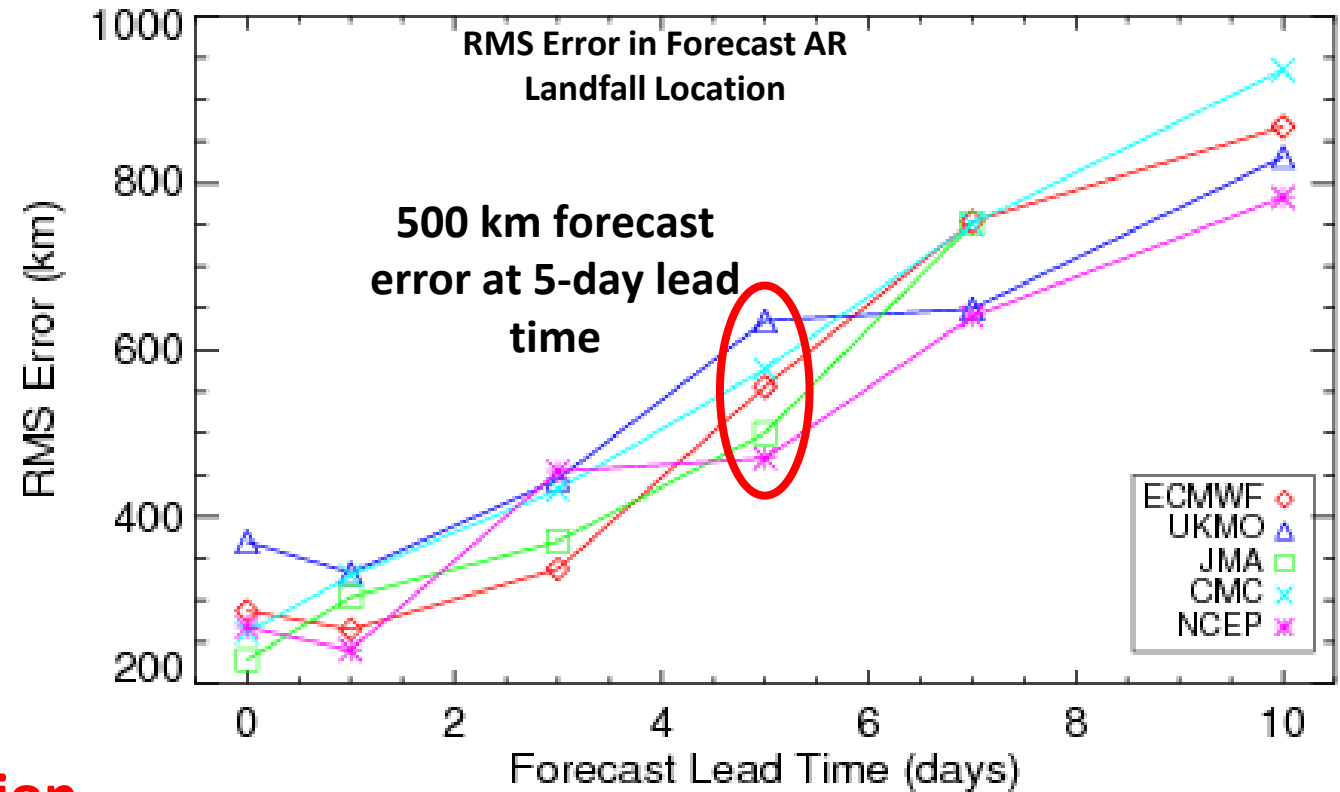
Forecasting large precipitation amounts is difficult



Of the 20 dates with >3 inches of precipitation in 1 day, 18 were associated with ARs.

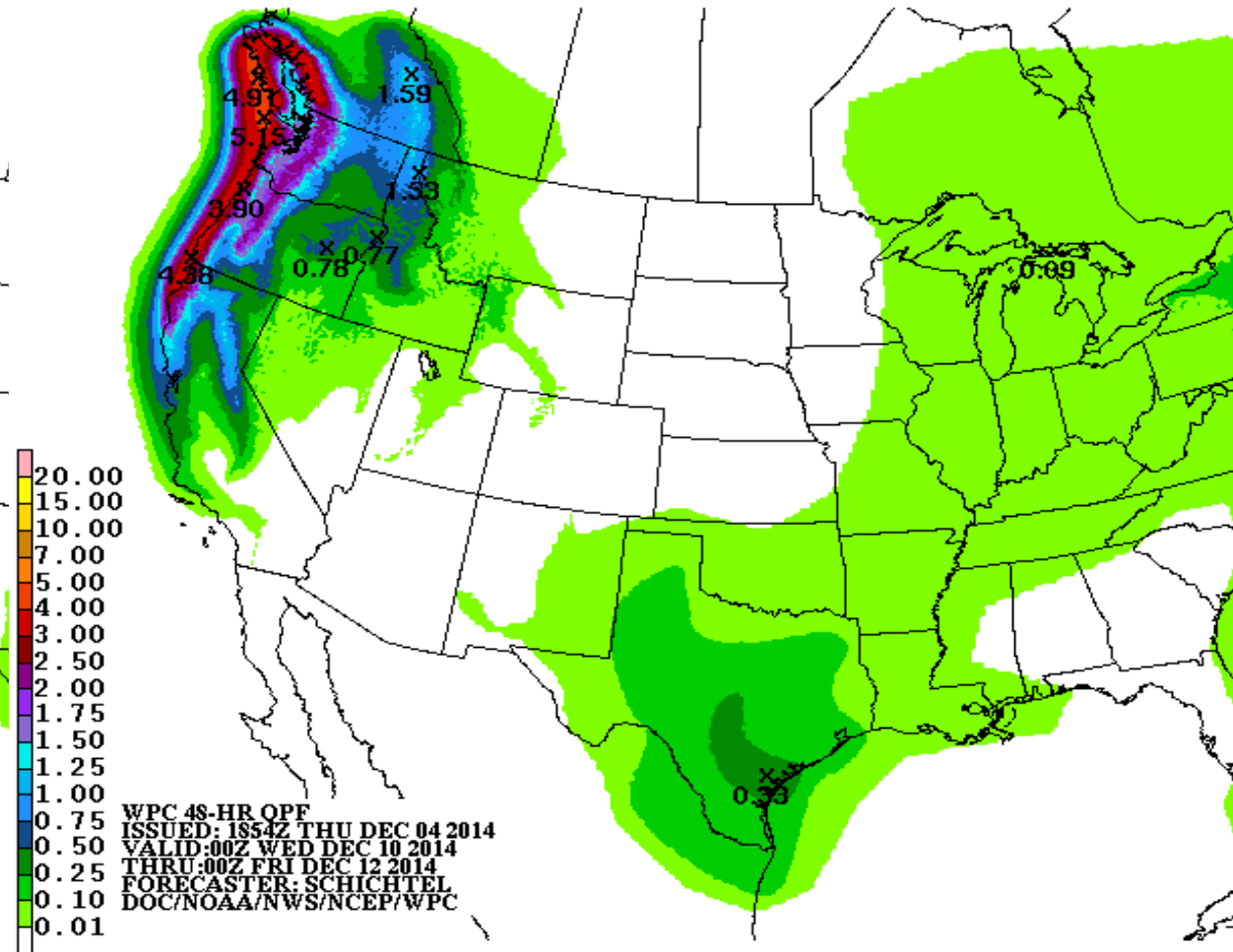
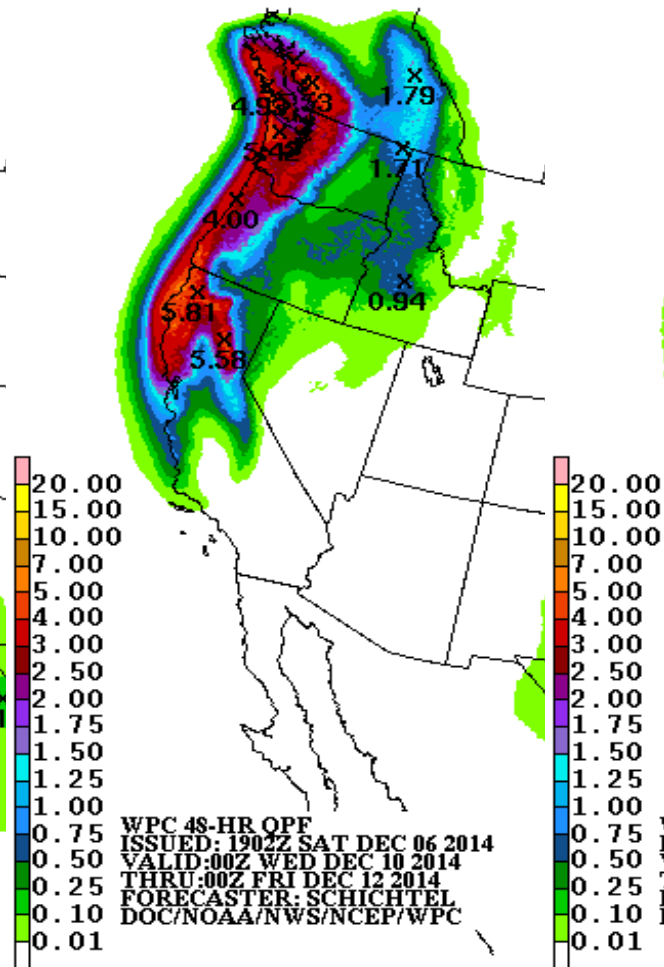
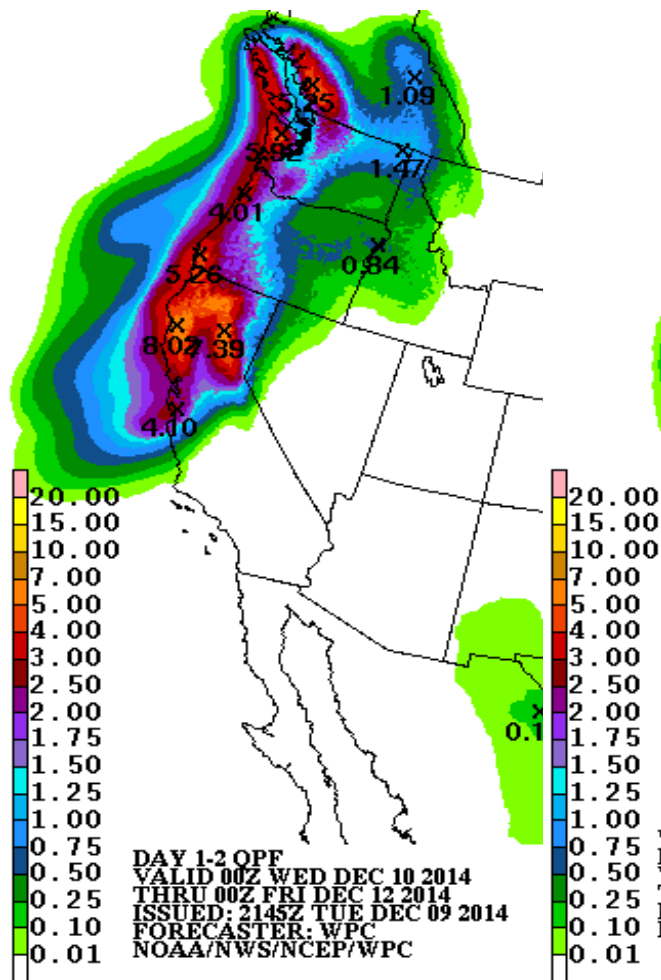
Ralph et al. 2010

Forecasting AR landfall includes position errors larger than watersheds



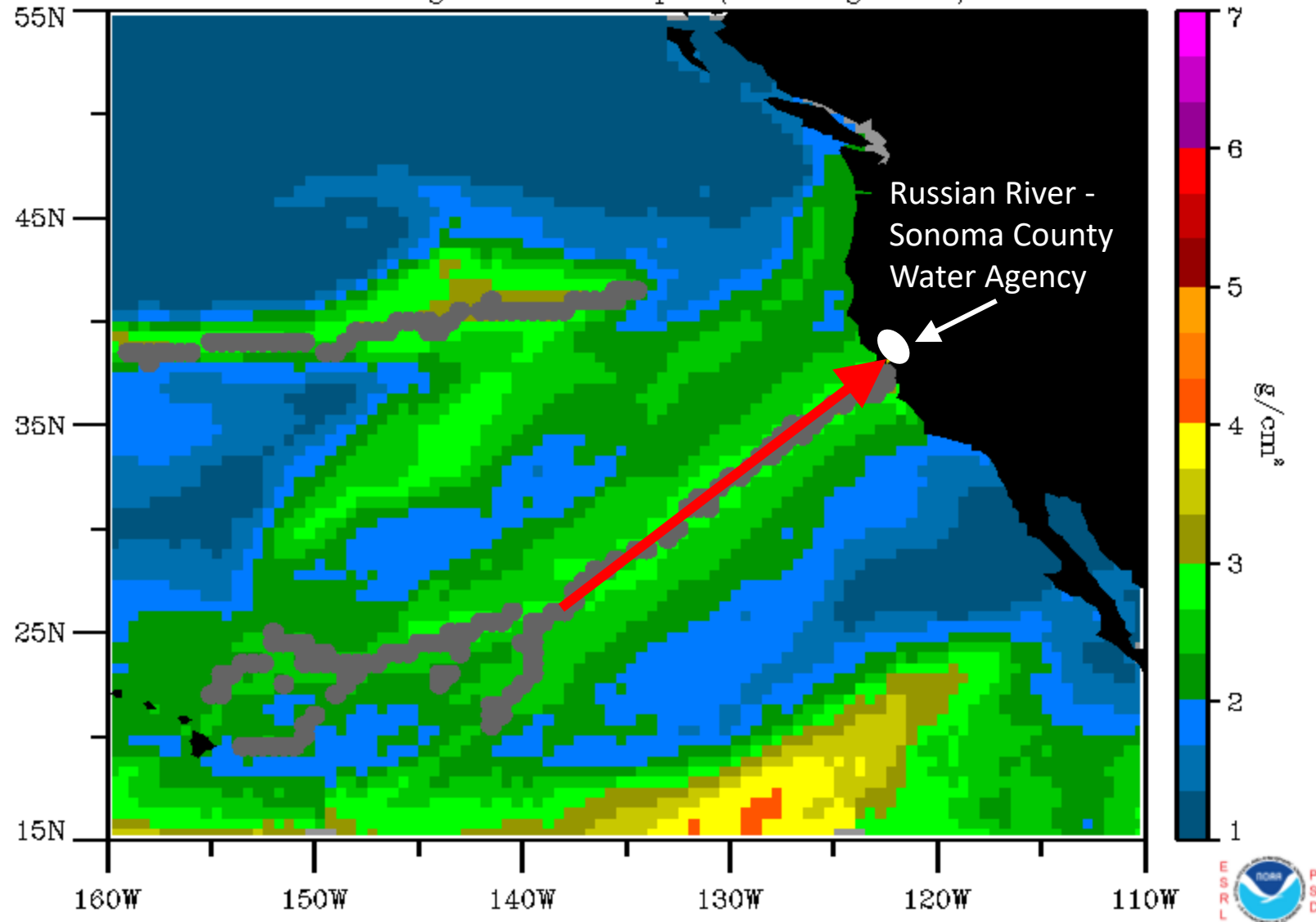
Wick et al. 2013

# 48-h QPF Dprog-Dt out to 7 days lead time ending 0000 UTC 12 Dec 2014



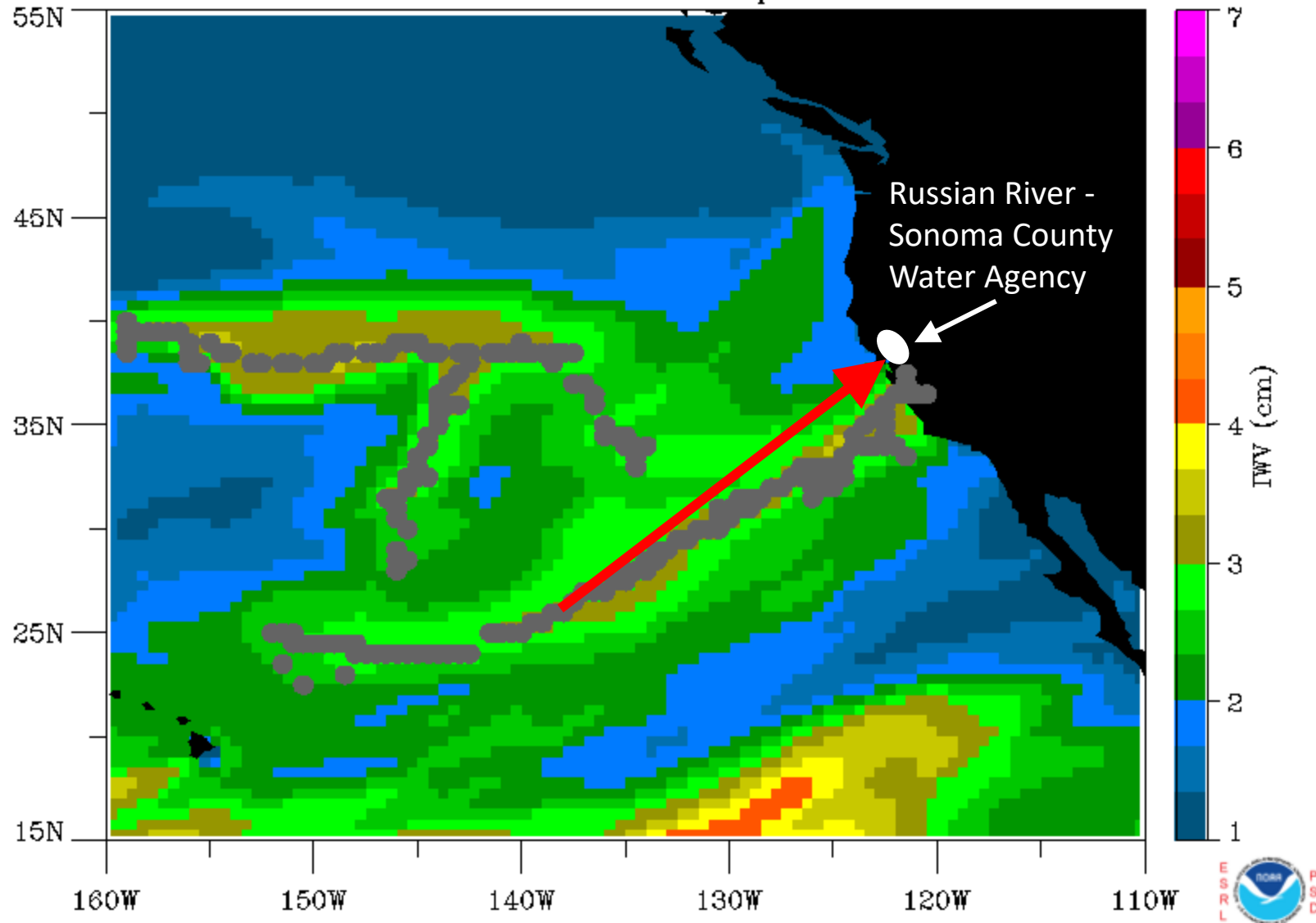
# Observed

March 14, 2012 Descending Passes  
SSMIS Integrated Water Vapor (Wentz algorithm)



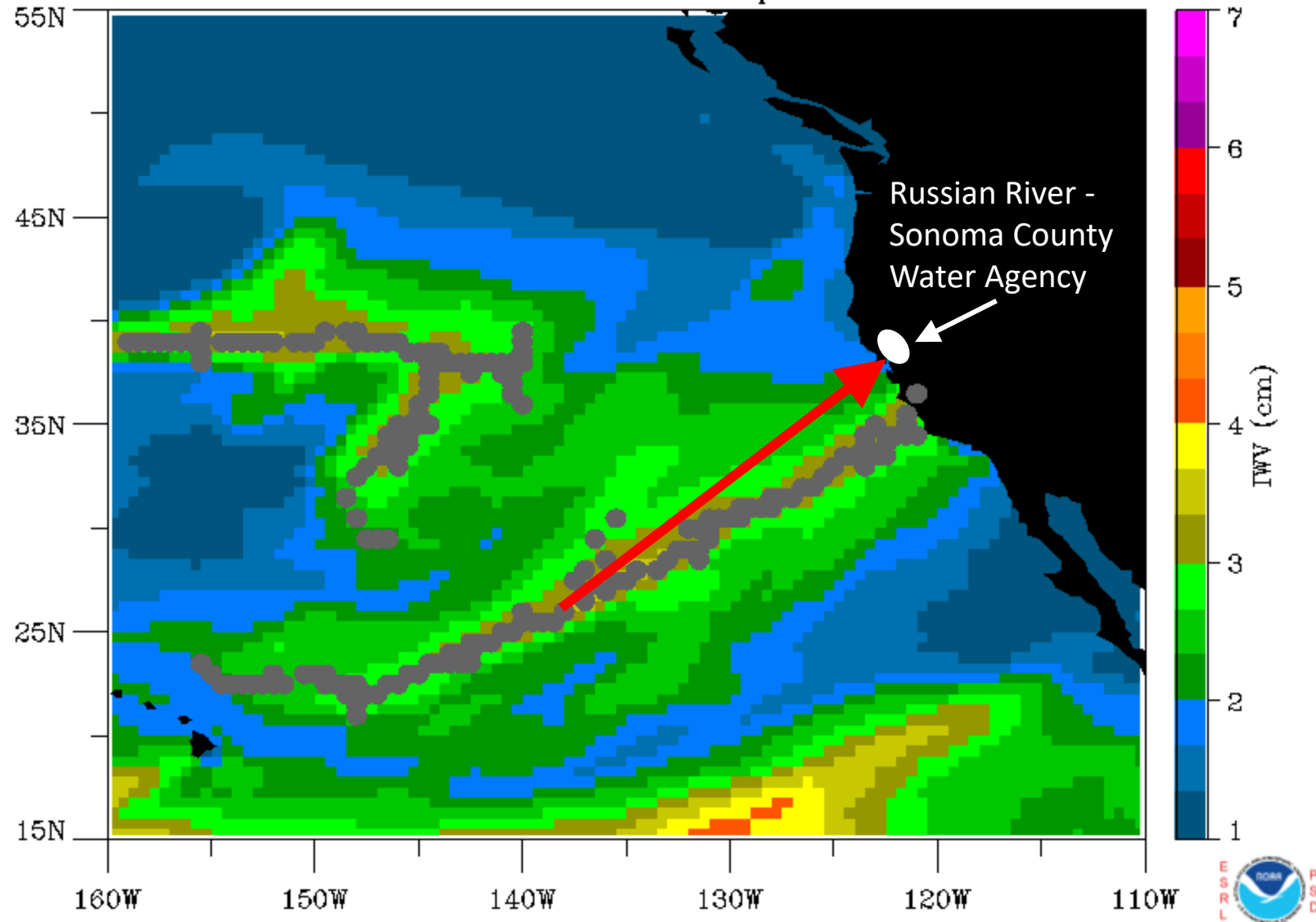
# 1-day GFS Forecast

20120313 024 Hour Forecast  
GFS Modeled Water Vapor



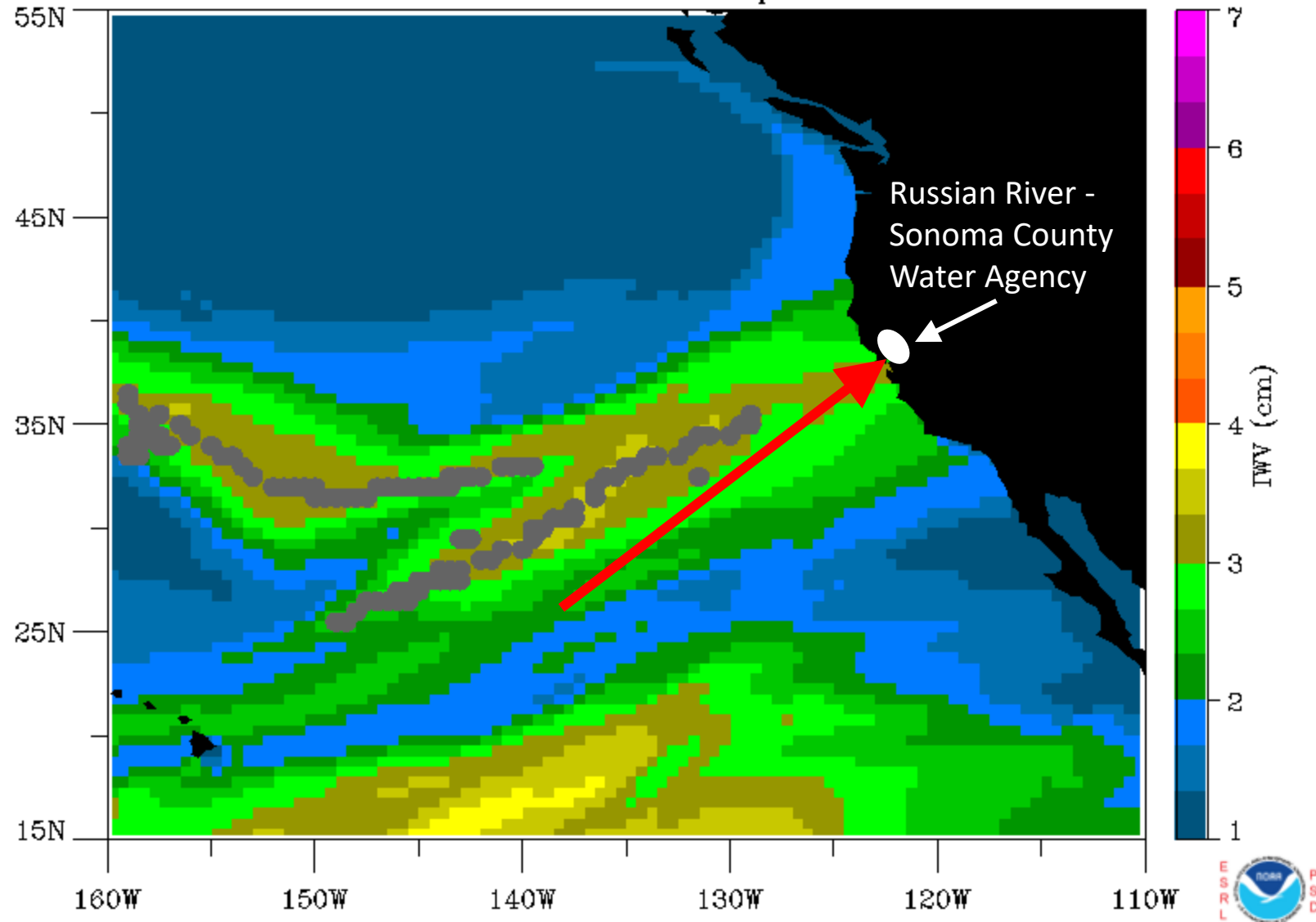
# 2-day GFS Forecast

20120312 048 Hour Forecast  
GFS Modeled Water Vapor



# 5-day GFS Forecast

20120309 120 Hour Forecast  
GFS Modeled Water Vapor



# 7-day GFS Forecast

20120307 168 Hour Forecast  
GFS Modeled Water Vapor

