

CW3E's Atmospheric River Monitoring and Forecast Product Development: Water Year 2018 S2S and AR Recon Highlights

F. Martin Ralph

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CW3E Advances in Atmospheric River Science, Observations, and Tools

Visualizations, Monitoring and Analysis: Monitoring and Prediction Tools – strength and location tracking; watershed scale products; regular outlooks → decision support

Forecasts: Example of significant forecast error in 2018
Week 2 and 3 AR outlooks
West-WRF – performance assessment relative to global models

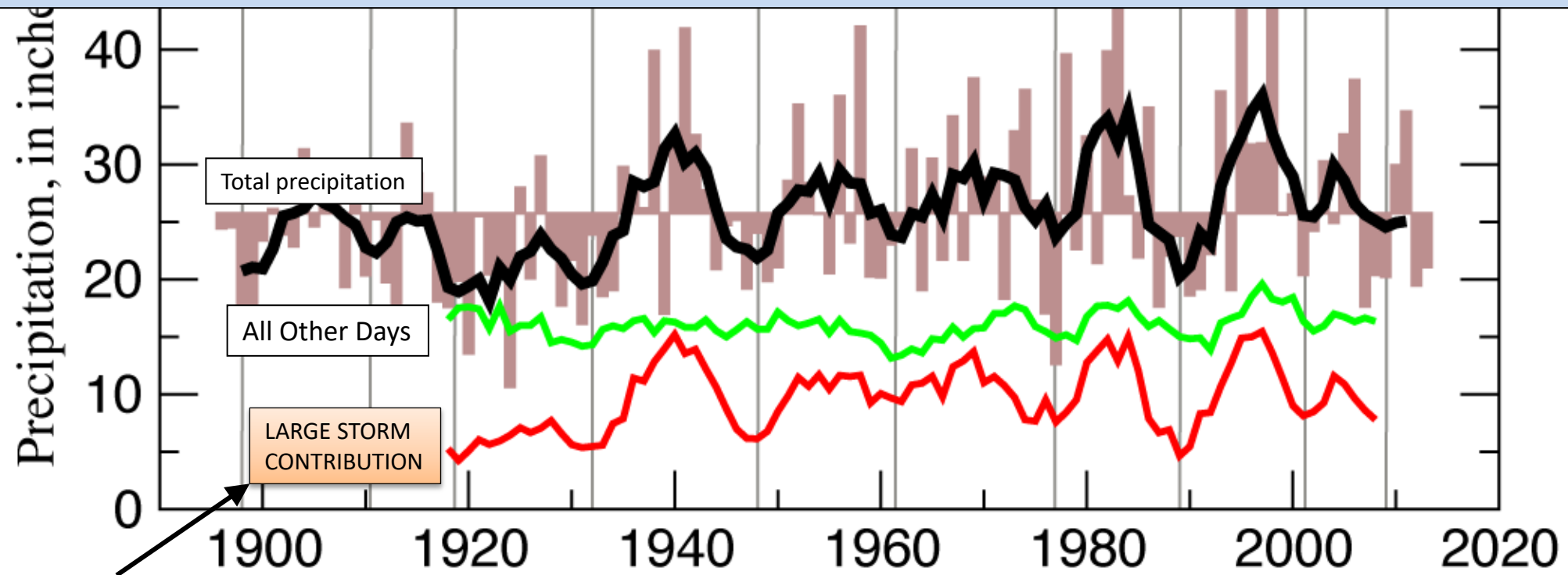
Observations: Atmospheric River Reconnaissance 2018



A few large storms (or their absence) account for a disproportionate amount of California's precipitation variability

a) Water-Year Precipitation, Delta Catchment

WHETHER A YEAR WILL BE WET OR DRY IN CALIFORNIA IS MOSTLY DETERMINED BY THE NUMBER AND STRENGTH OF ATMOSPHERIC RIVERS STRIKING THE STATE.



- 85% of interannual variability results from how wet the 5% wettest days are each year.
- These days are mostly atmospheric river events.

Dettinger and Cayan **Drought and the Delta—A Matter of Extremes**
San Francisco Estuary and Watershed Science, April 2014

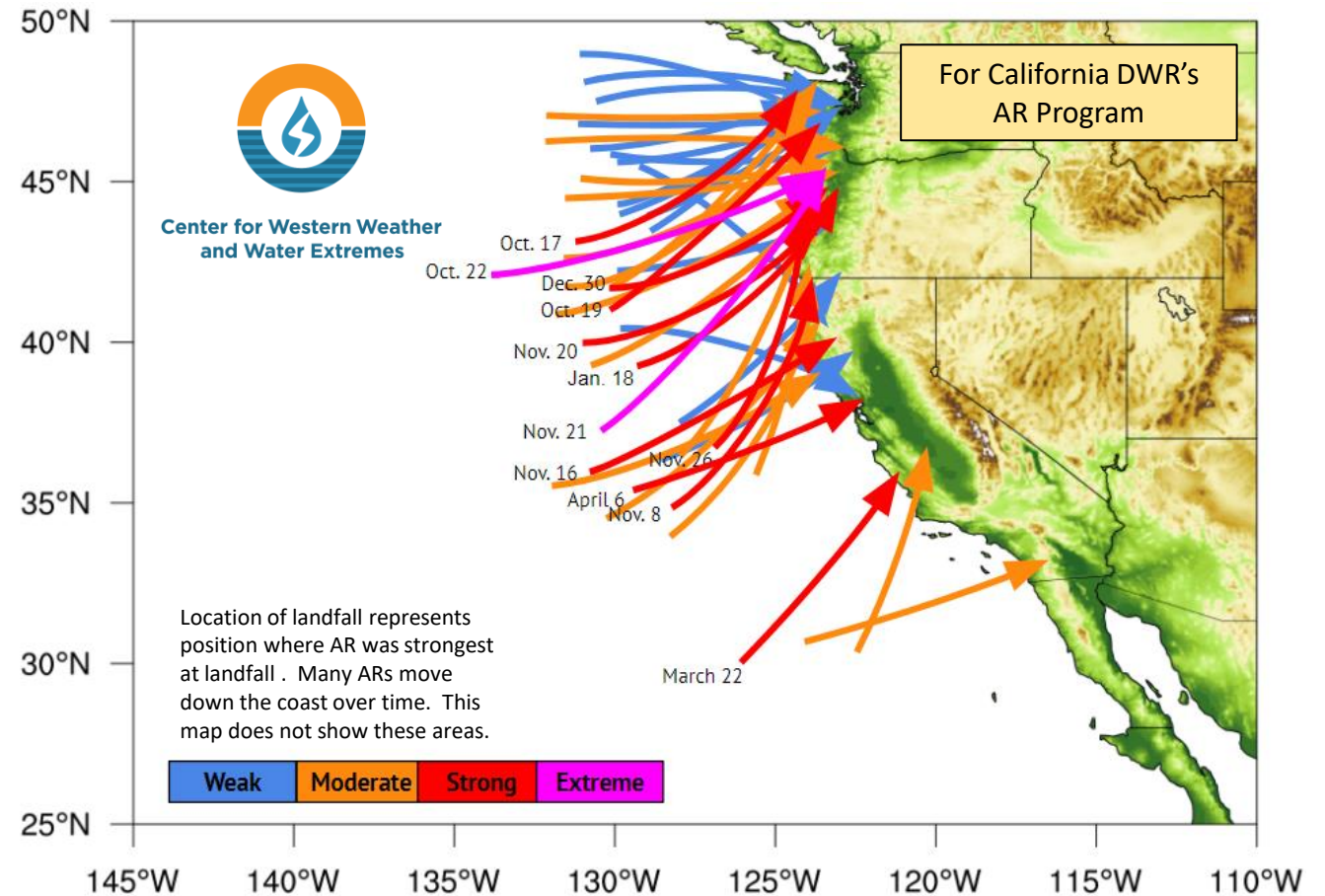
Distribution of Landfalling Atmospheric Rivers on the U.S. West Coast During Water Year 2018 Through April

AR Strength	AR Count
Weak	16
Moderate	16
Strong	10
Extreme	2
Exceptional	0

Ralph/CW3E AR Strength Scale

Weak	IVT=250–500 $\text{kg m}^{-1} \text{s}^{-1}$
Moderate	IVT=500–750 $\text{kg m}^{-1} \text{s}^{-1}$
Strong	IVT=750–1000 $\text{kg m}^{-1} \text{s}^{-1}$
Extreme	IVT=1000–1250 $\text{kg m}^{-1} \text{s}^{-1}$
Exceptional	IVT>1250 $\text{kg m}^{-1} \text{s}^{-1}$

- **44** Atmospheric Rivers made landfall on the West Coast during the 2018 water year through April



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Provided by C. Hecht and F.M. Ralph

Experimental

AR Strength by Month 2018

AR Strength	Oct	Nov	Dec	Jan	Feb	Mar	Apr
Weak	2	1	2	3	4	2	2
Mod.	0	2	3	7	1	3	0
Strong	2	4	1	1	0	1	1
Extreme	1	1	0	0	0	0	0
Excep.	0	0	0	0	0	0	0
Total	5	8	6	7	5	6	3

Ralph/CW3E AR Strength Scale

- Weak: $\text{IVT}=250\text{--}500 \text{ kg m}^{-1} \text{ s}^{-1}$
- Moderate: $\text{IVT}=500\text{--}750 \text{ kg m}^{-1} \text{ s}^{-1}$
- Strong: $\text{IVT}=750\text{--}1000 \text{ kg m}^{-1} \text{ s}^{-1}$
- Extreme: $\text{IVT}>1000 \text{ kg m}^{-1} \text{ s}^{-1}$

Number of AR occurrences by state/region

Washington	Oregon	NorCal	SoCal
38	43	31	17



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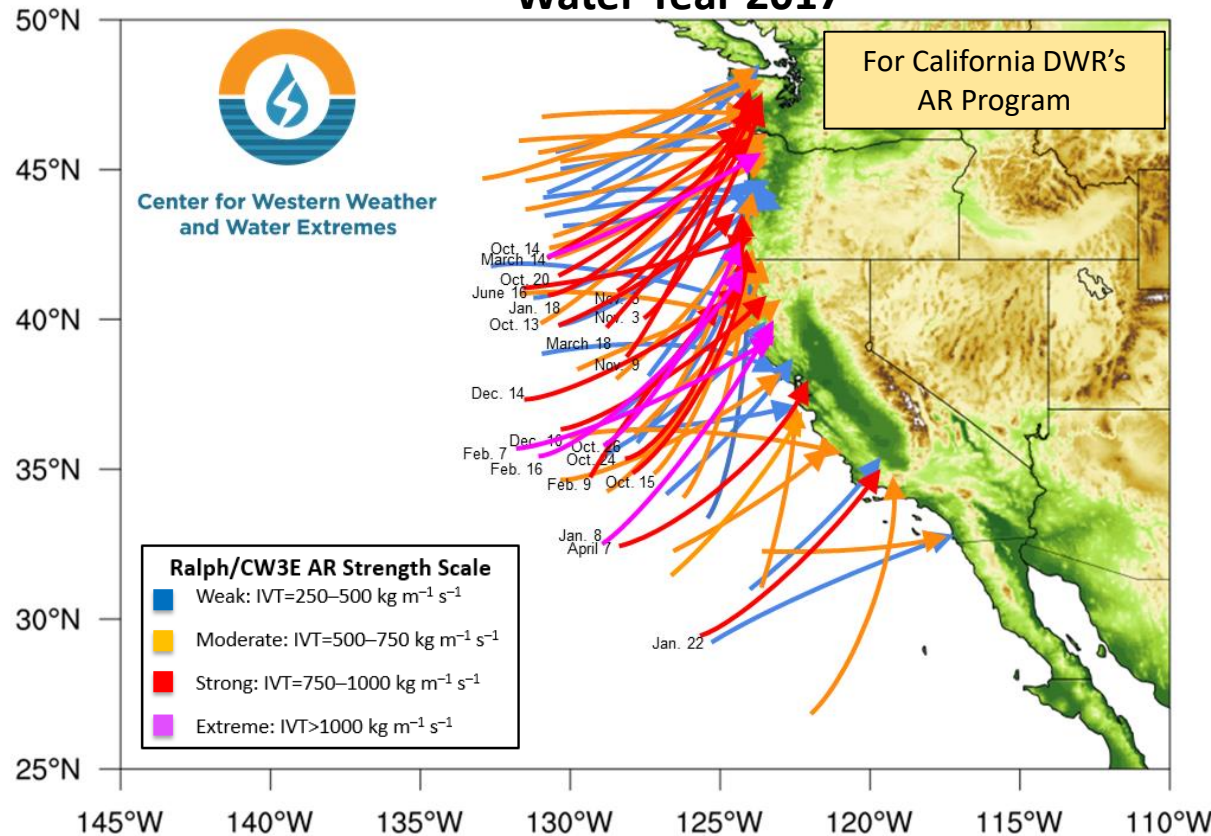
Provided by C. Hecht and F.M. Ralph

Experimental

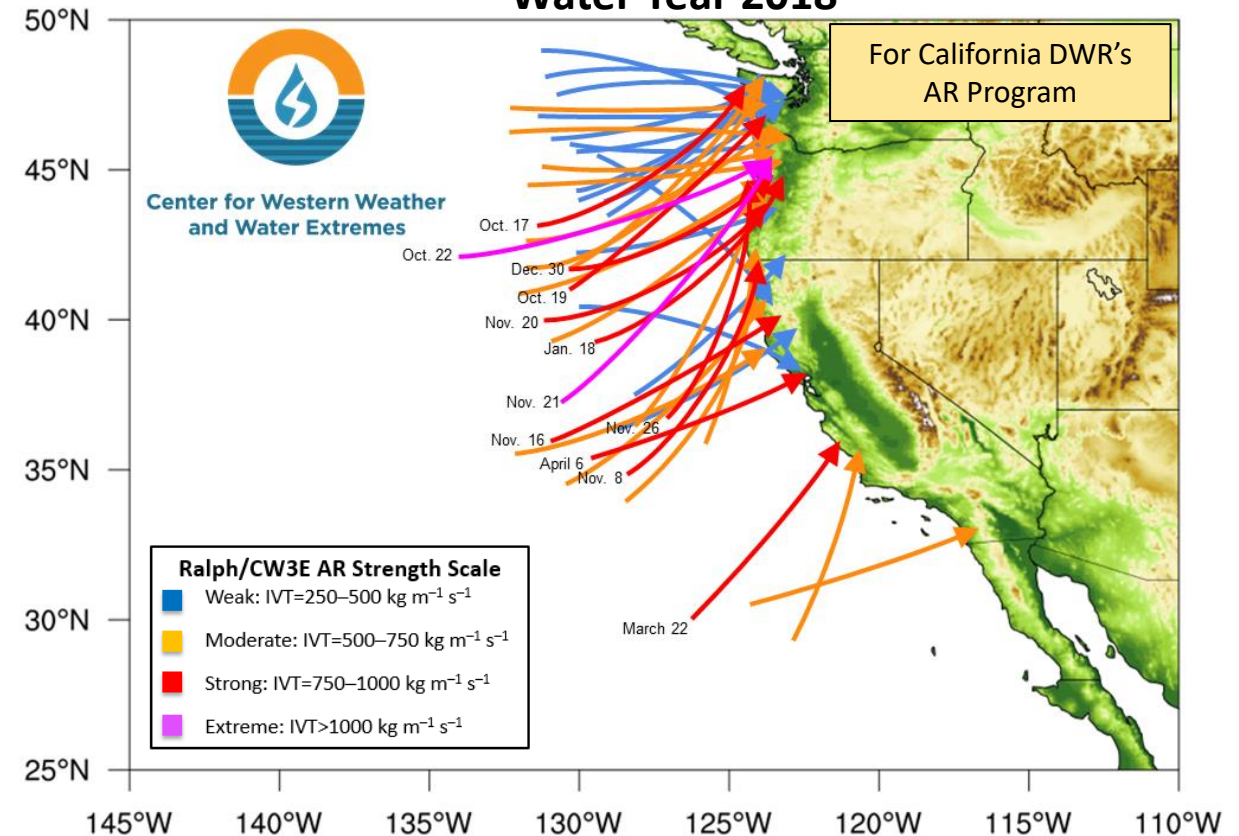
WY 2018 Compared to WY 2017

- The record breaking WY 2017 experienced a total of 68 landfalling ARs over the U.S. West Coast
- 60 of the total 68 ARs occurred through April 2017, compared to 44 experienced this WY through April

Water Year 2017



Water Year 2018



- When compared to WY 2017, a larger proportion of landfalling ARs during WY 2018 made landfall over the Pacific Northwest



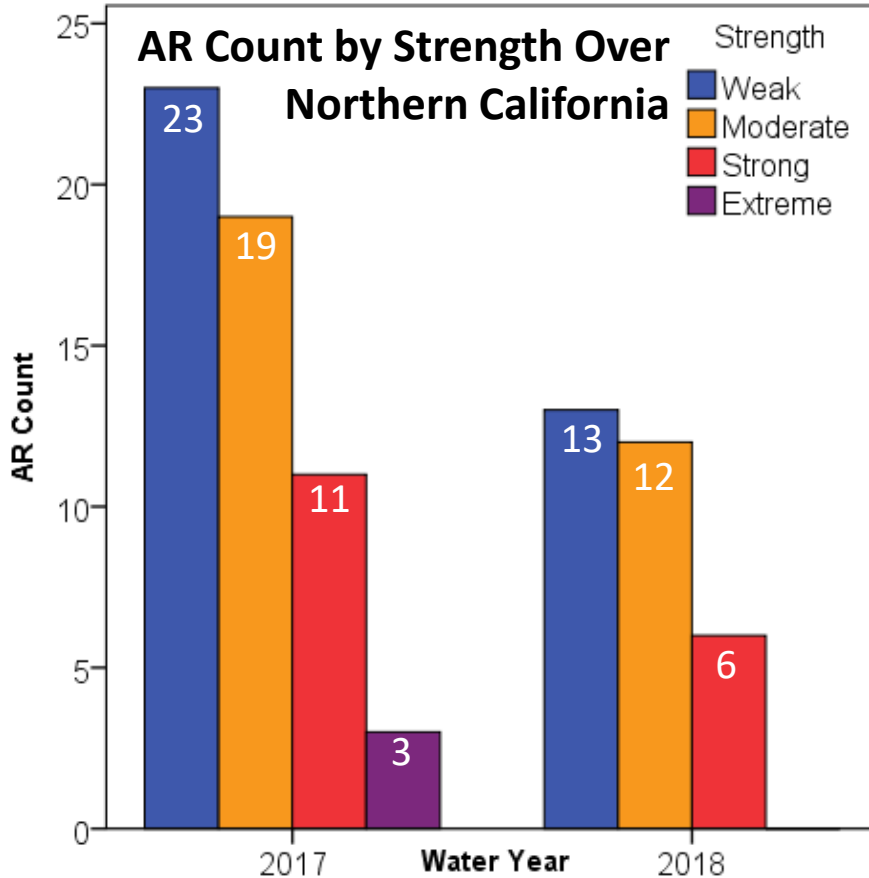
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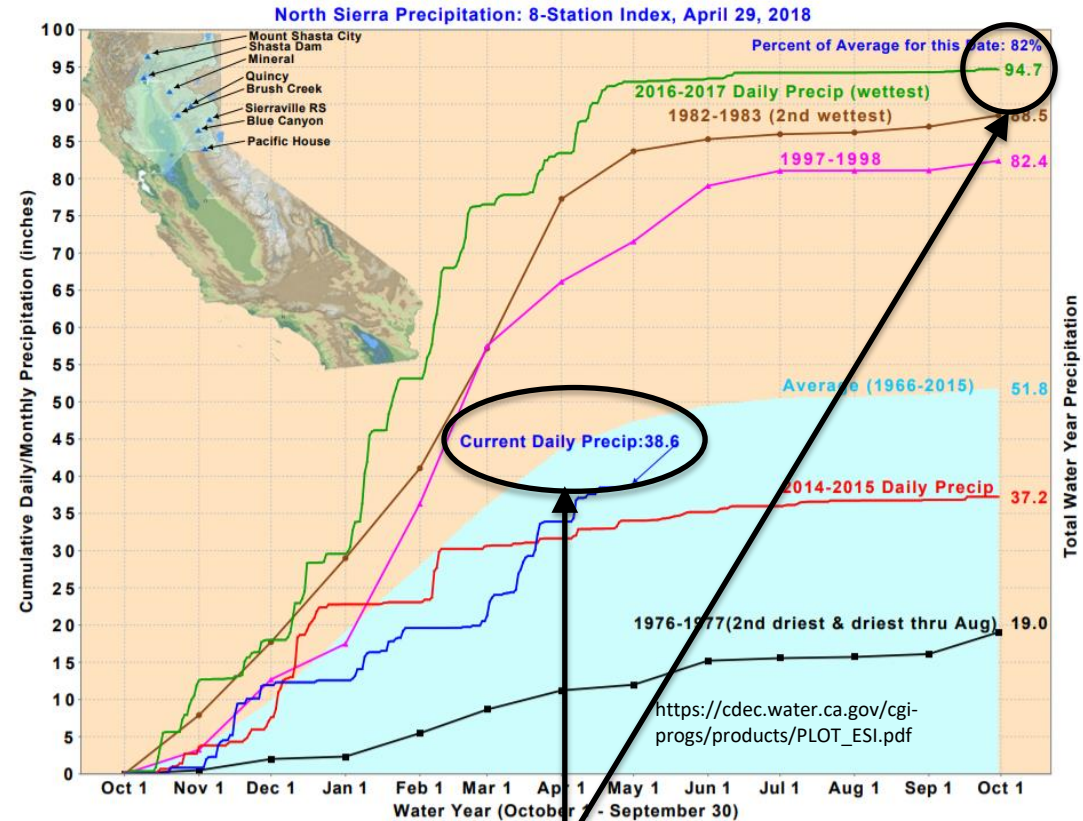
Provided by C. Hecht and F.M. Ralph

Experimental

Northern California Analysis



- 42 weak or mod. ARs occurred over Northern CA during WY 2017, compared to 25 during WY 2018
- WY 2017 also experienced 14 strong or extreme ARs compared to only 6 strong ARs during WY 2018



- The differences in frequency and strength of landfalling ARs resulted in large differences in WY precipitation over the Northern Sierra 8-Station Index
- The index received ~56 more ins. of precipitation during WY 2017 than WY 2018 to date (94.7 in. vs. 38.6 in.)



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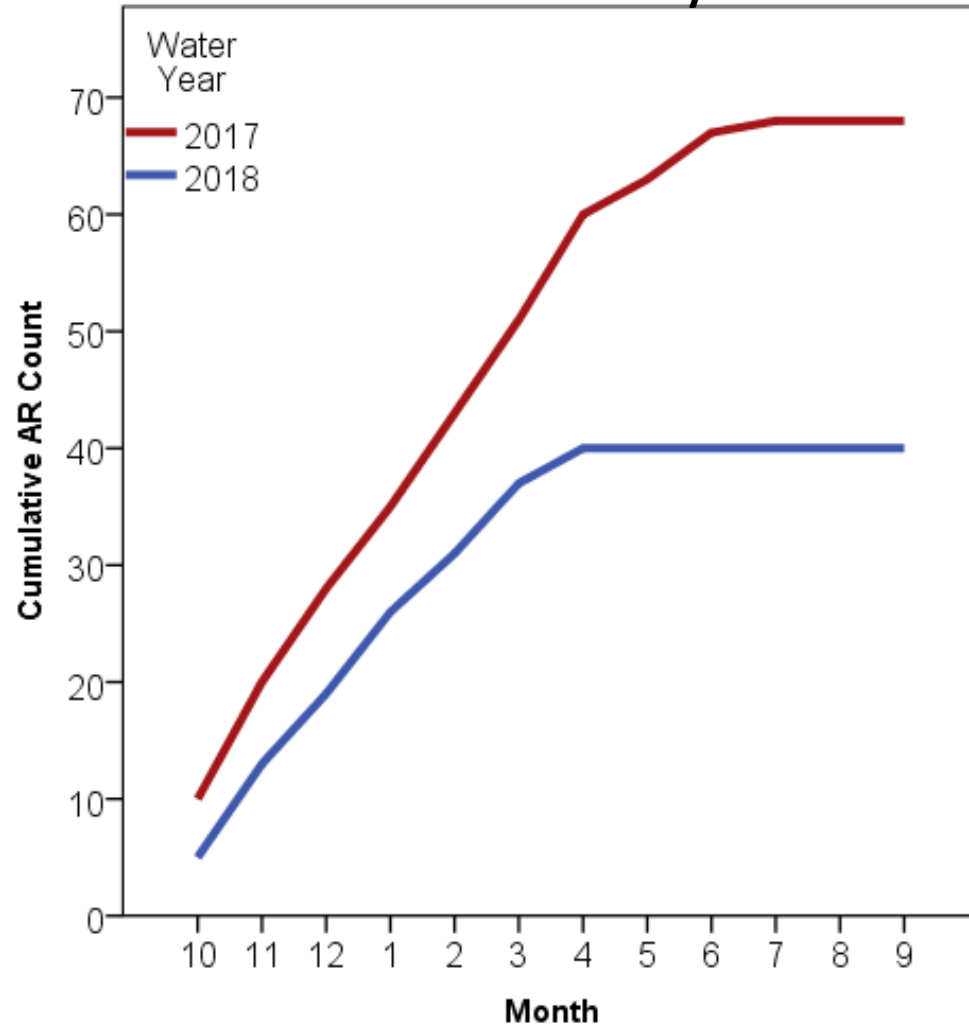
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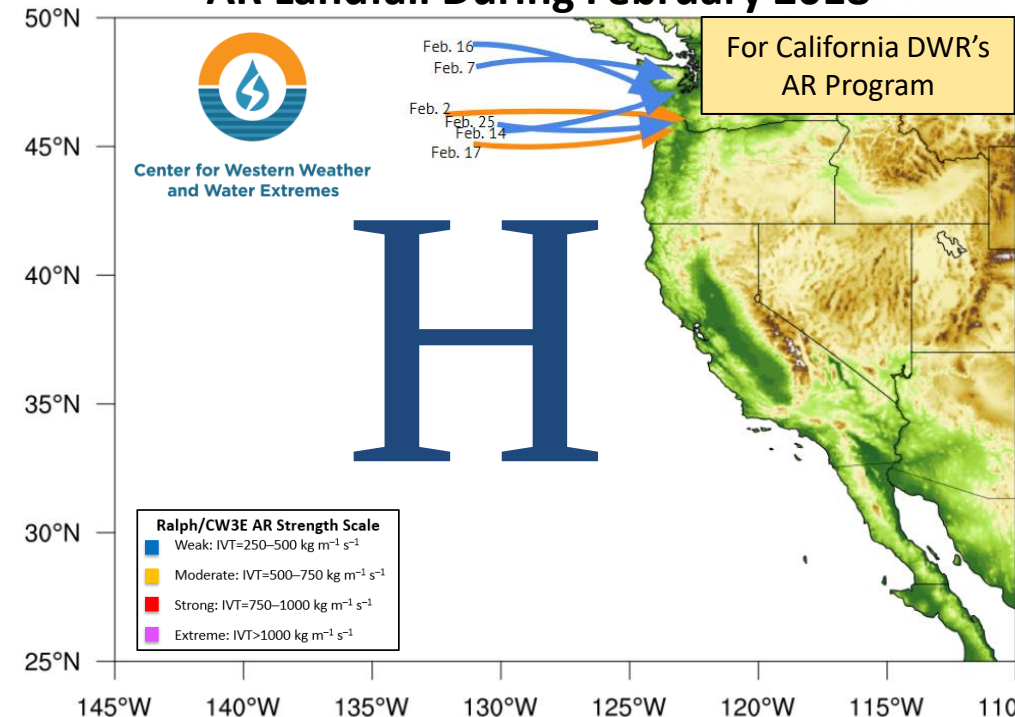
Experimental

Atmospheric Rivers by Month

Cumulative AR Count by Month



AR Landfall During February 2018



- WY 2017 experienced several more AR landfalls per month when compared to WY 2018
- Feb. 2018 was also dominated by persistent ridging and high pressure over the Eastern Pacific
- All ARs that made landfall during Feb. 2018 were westerly/northwesterly oriented and over the Pacific Northwest likely leading to small impacts and leaving California dry



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Experimental

AR Forecasts at S2S Lead Times



CW3E Partnership for Week 2-3 Outlooks

CW3E S2S Advisory Panel: Marty Ralph (PI; Chair), Dan Cayan, Duane Waliser, Bruce Cornuelle, Art Miller, Elizabeth Barnes

For California
DWR's AR Program



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Jet Propulsion Laboratory
California Institute of Technology



**Plymouth State
University**



**Colorado State
University**



CW3E-SIO Team: Aneesh Subramanian (Lead), Sasha Gershunov, Zhenhai Zhang, Kristen Guirguis, Will Chapman, Tamara Shulgina, Anna Wilson, Minghua Zheng, Brian Kawzenuk

JPL: Duane Waliser, Bin Guan, Mike DeFlorio, Alex Goodman

PSU: Jay Cordeira

CSU: Elizabeth Barnes, Kyle Nardi

Data and collaborations from WCRP / WWRP S2S Project



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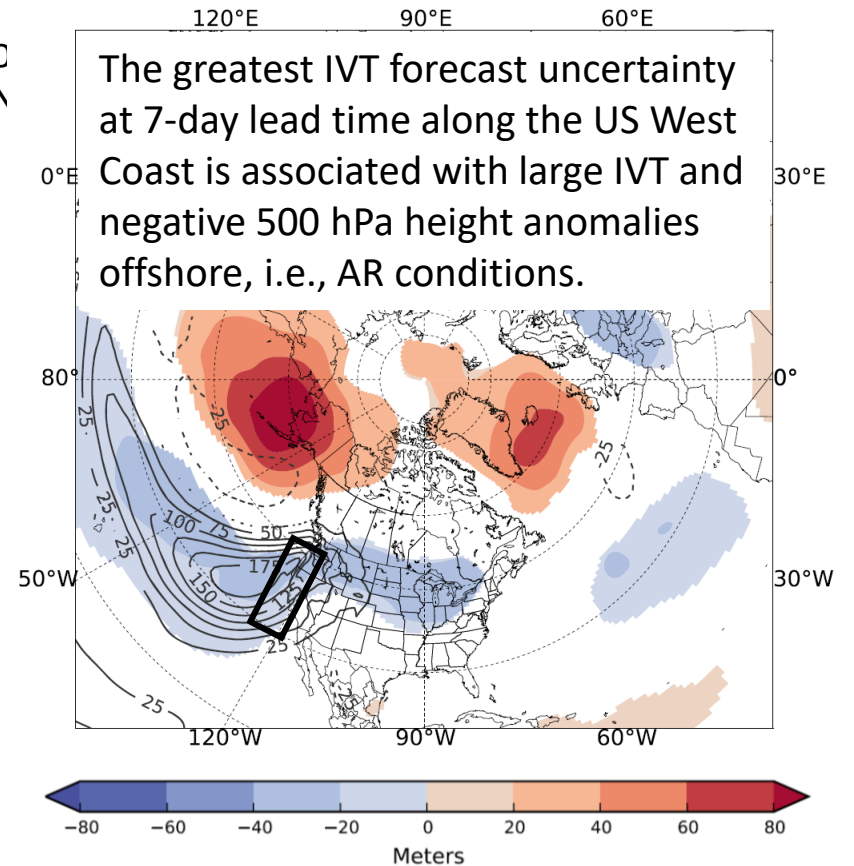
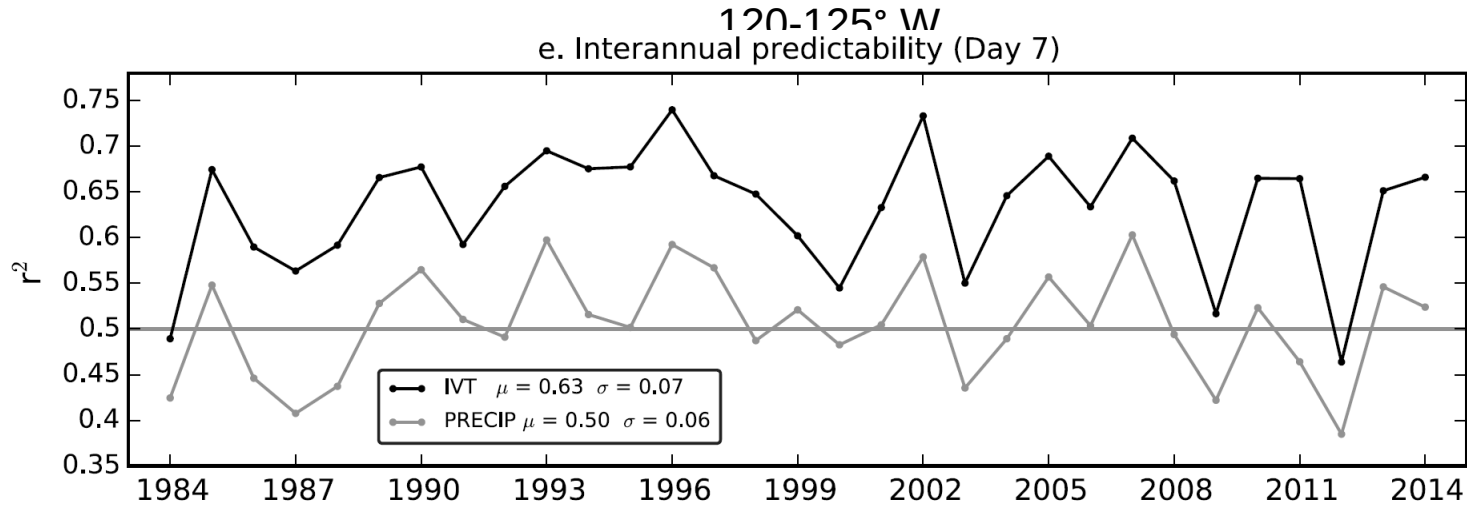
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Provided by A. Subramanian

Predictability of horizontal water vapor transport relative to precipitation: Enhancing situational awareness for forecasting western U.S. extreme precipitation and flooding

David A. Lavers, Duane E. Waliser, F. Martin Ralph, Michael D. Dettinger, *Geophys. Res. Lett.* 2016

Applying the potential predictability concept to NCEP global ensemble reforecasts, across 31 winters, IVT is found to be more predictable than precipitation in the region 30-50°N



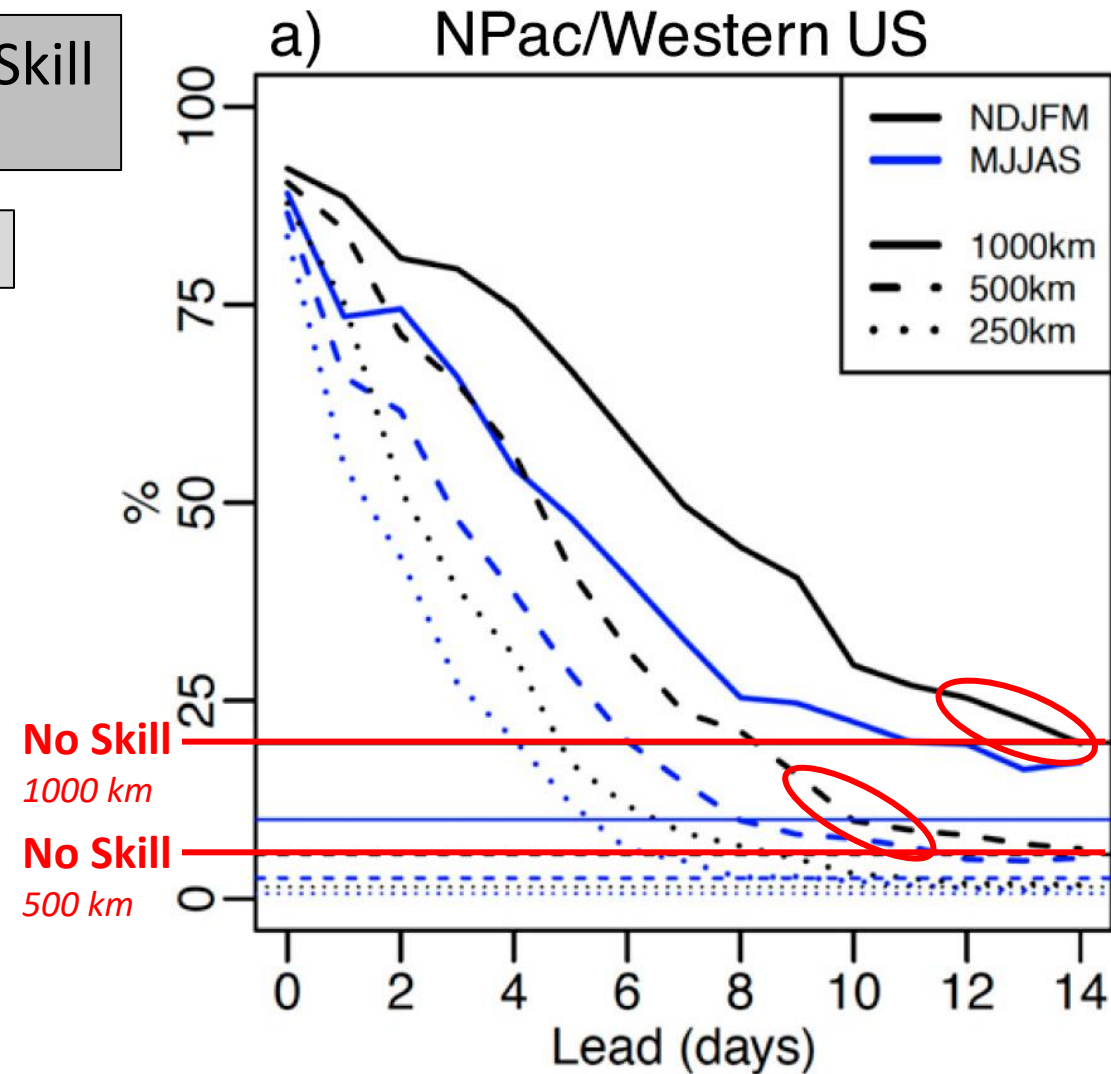
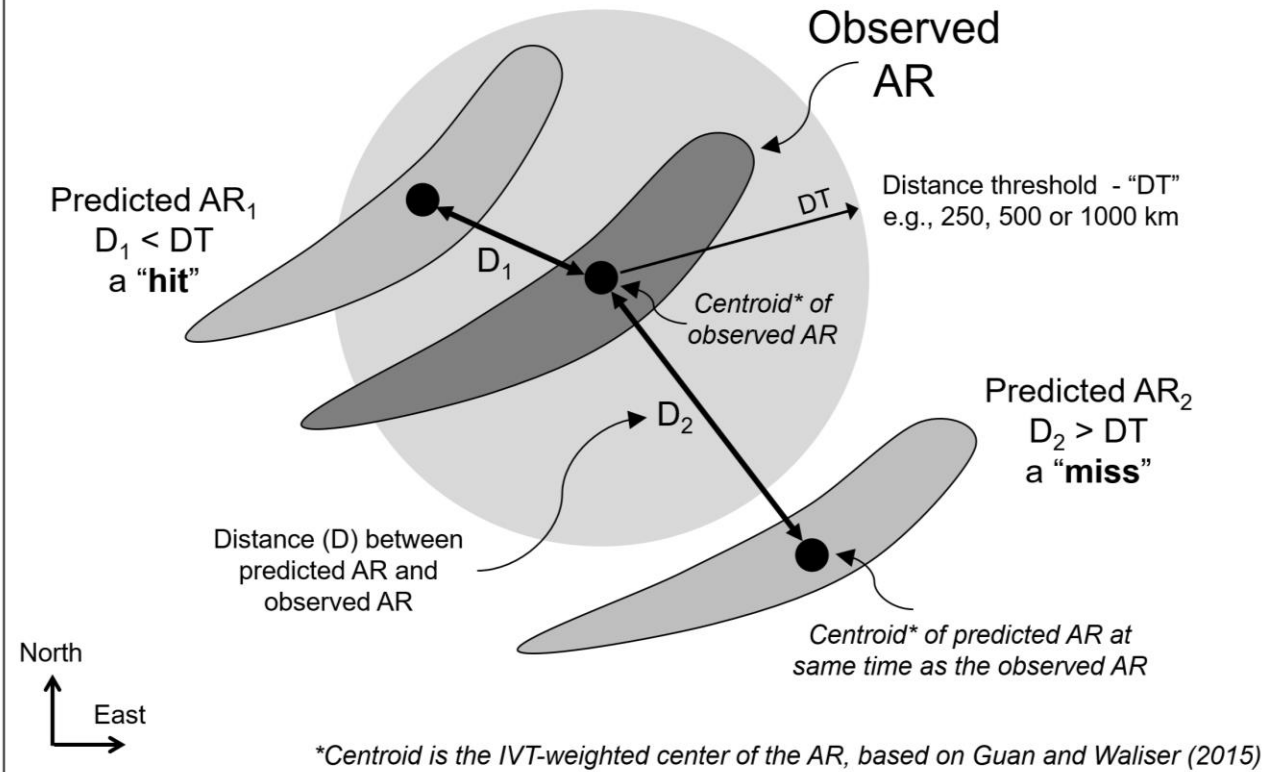
Composite mean of the 500 hPa geopotential height anomalies at the analysis time (shading, in meters) and of the ensemble mean IVT forecast anomalies (contours, dashed where less than climatology) during the 140 largest ensemble spreads on forecast day 7. Colored and contoured regions indicate areas where the composite mean is different from zero at the 90% significance level.

Global Assessment of Atmospheric River Prediction Skill

DeFlorio, Waliser, Guan, Lavers and Ralph (*JHM* 2018)

Uses ECMWF forecasts and Guana and Waliser (2015) AR Catalog

Method of determining if a predicted atmospheric river (AR) is a “hit” or a “miss” relative to an observed AR



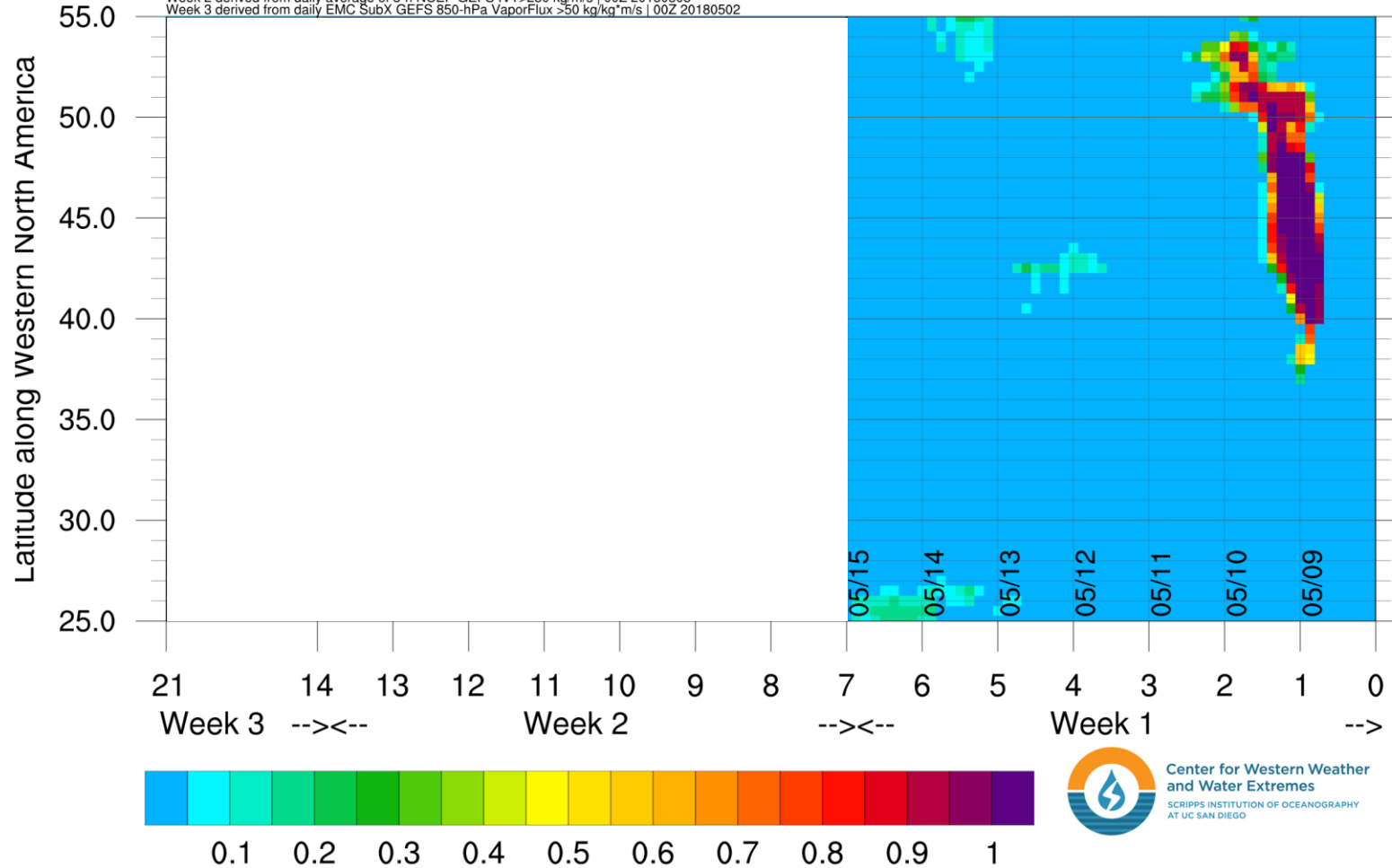
In Cool Season there is some AR forecast skill for 500 km distance threshold out to 10 days for 1000 km distance threshold out to 12 days

AR Landfall tool for week-1

CW3E Likelihood of AR Conditions at the Coast

Tue 8 May 2018

Week 1 derived from 3-h NCEP GEFS IVT > 250 kg/m/s | 00Z 20180508
Week 2 derived from daily average of 3-h NCEP GEFS IVT > 250 kg/m/s | 00Z 20180508
Week 3 derived from daily EMC SubX GEFS 850-hPa VaporFlux > 50 kg/kg*m/s | 00Z 20180502



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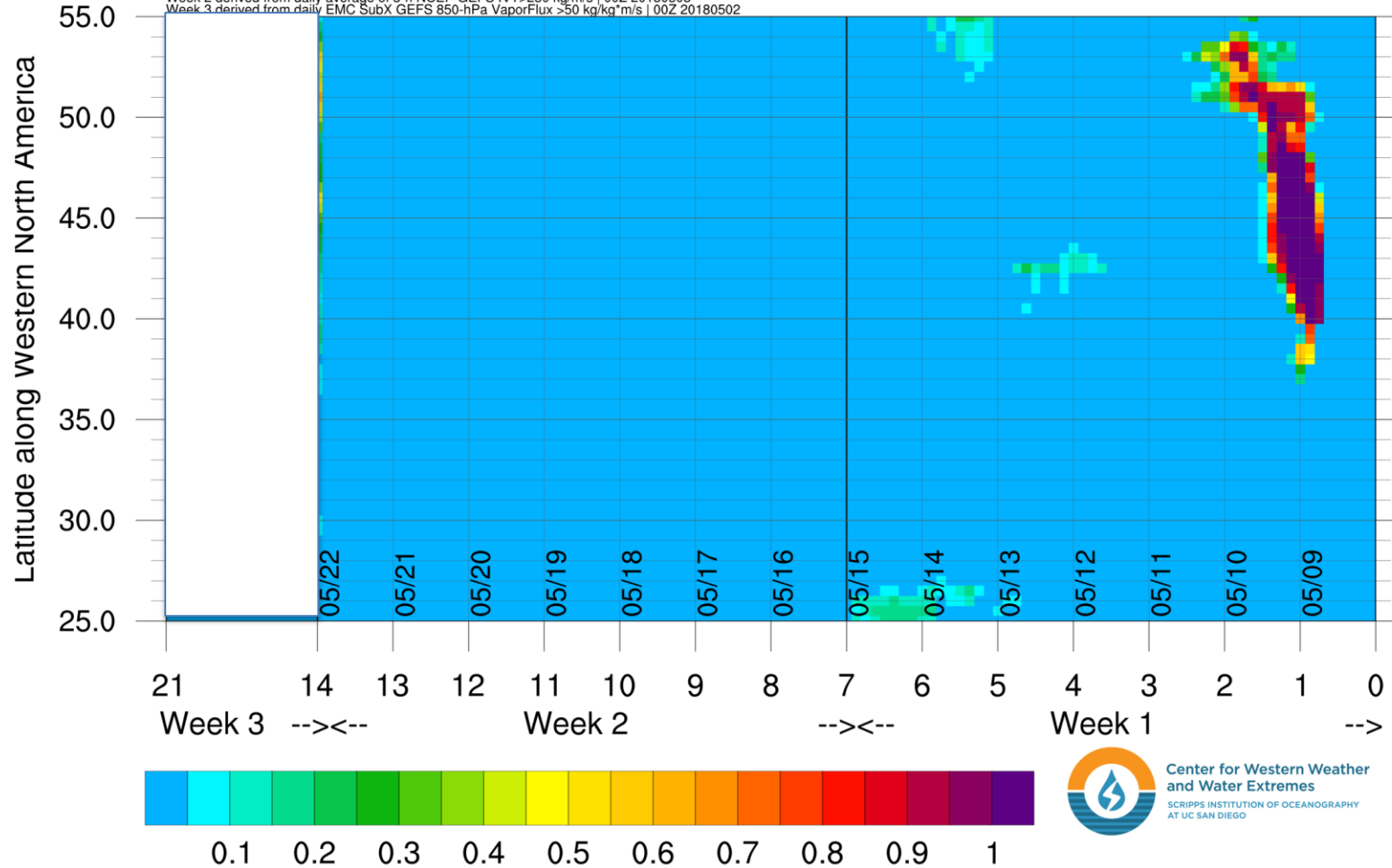
Provided by A. Subramanian

AR Landfall tool extended to week-2

CW3E Likelihood of AR Conditions at the Coast

Tue 8 May 2018

Week 1 derived from 3-h NCEP GEFS IVT > 250 kg/m/s | 00Z 20180508
Week 2 derived from daily average of 3-h NCEP GEFS IVT > 250 kg/m/s | 00Z 20180508
Week 3 derived from daily EMC SubX GEFS 850-hPa VaporFlux > 50 kg/kg*m/s | 00Z 20180502



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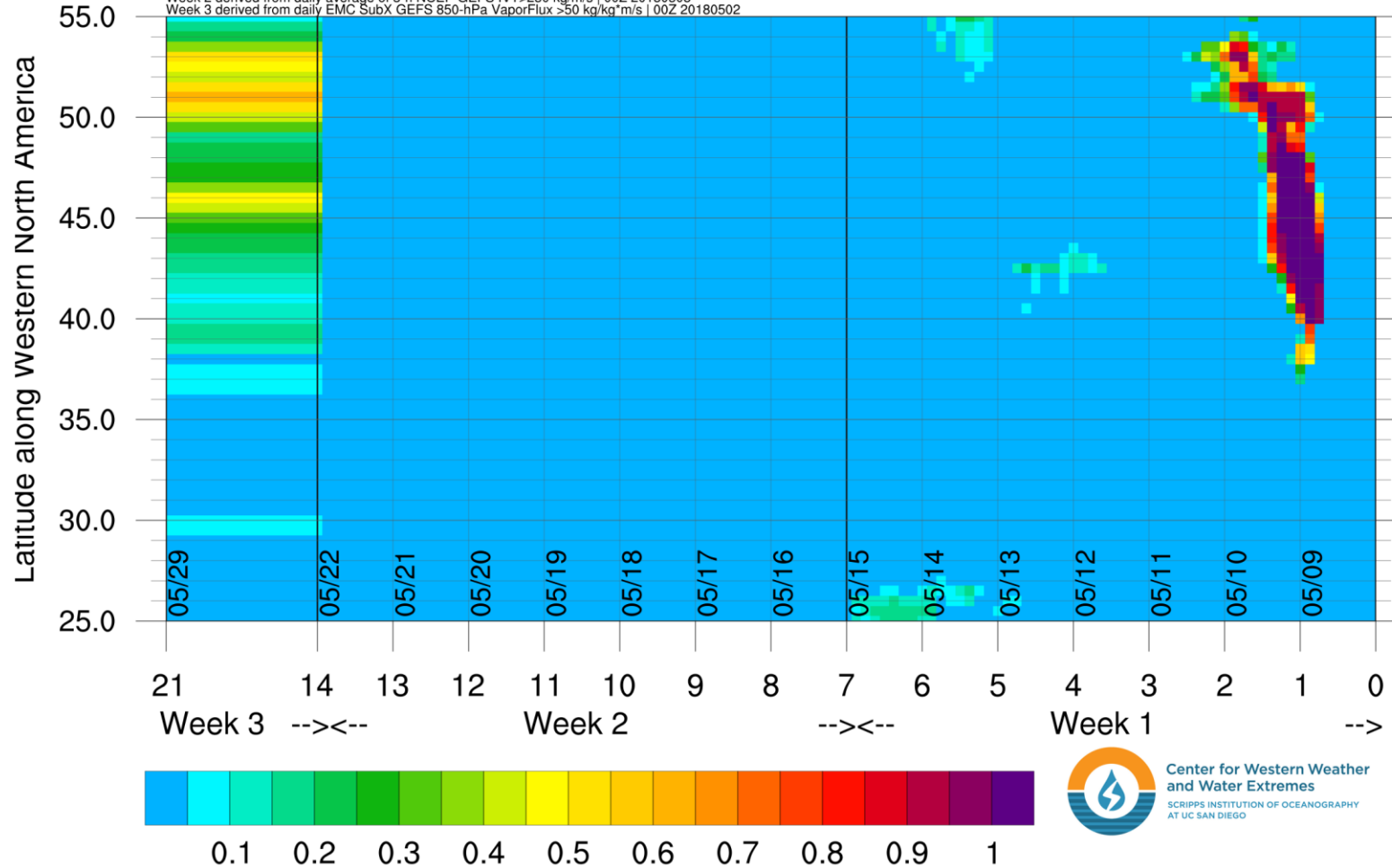
Provided by A. Subramanian

AR Landfall tool extended to week-3

CW3E Likelihood of AR Conditions at the Coast

Tue 8 May 2018

Week 1 derived from 3-h NCEP GEFS IVT > 250 kg/m/s | 00Z 20180508
Week 2 derived from daily average of 3-h NCEP GEFS IVT > 250 kg/m/s | 00Z 20180508
Week 3 derived from daily EMC SubX GEFS 850-hPa VaporFlux > 50 kg/kg*m/s | 00Z 20180502



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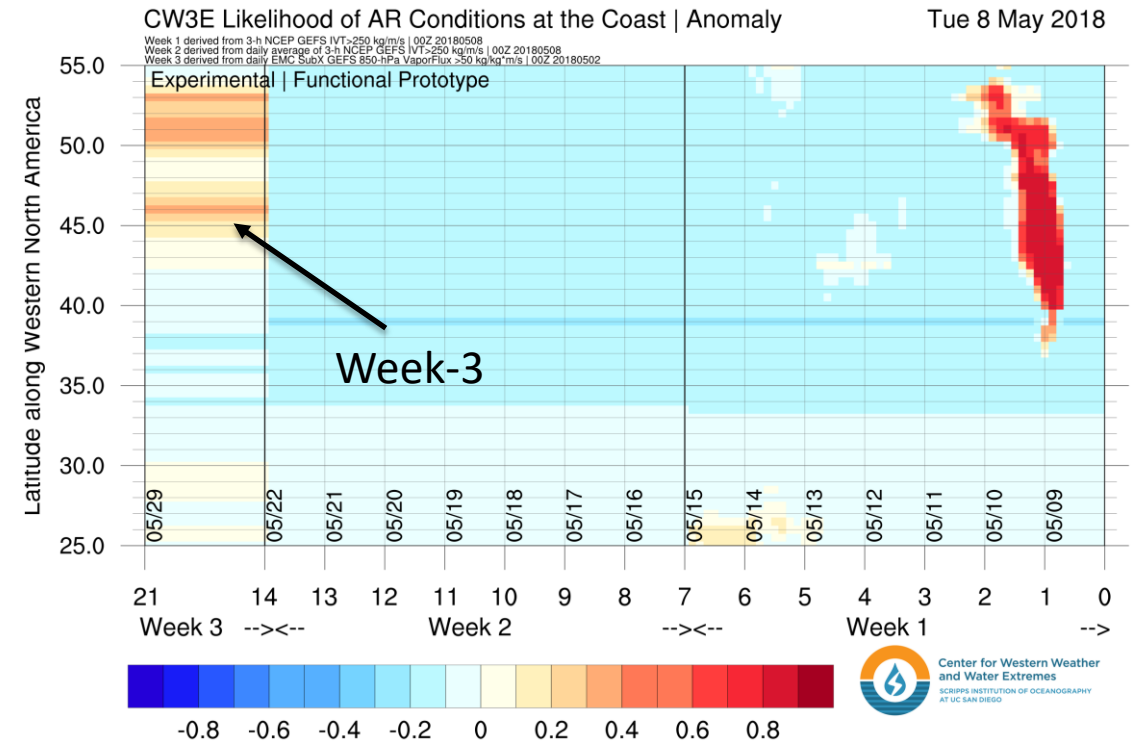
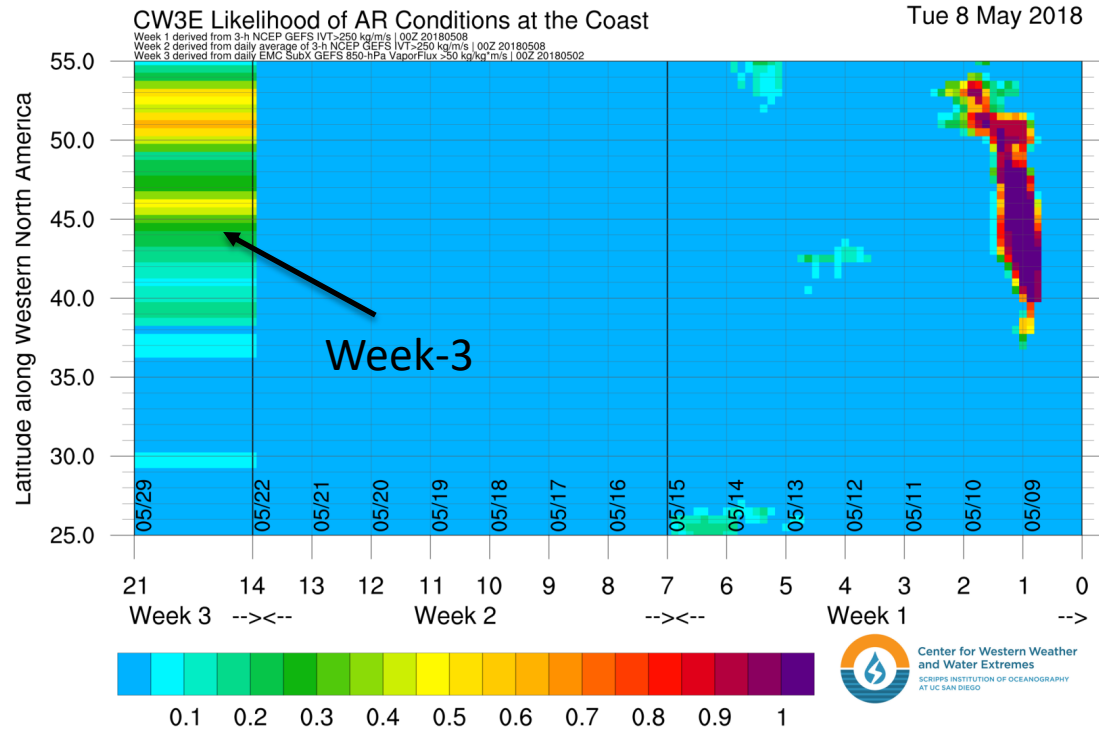


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AR Landfall tool extended to week-3



S2S version of AR Landfall Tool (Cordeira et al.)

- Week-1: 3-h probability for $IVT > 250 \text{ kg m}^{-1} \text{ s}^{-1}$
- Week-2: Daily probability for $IVT > 250 \text{ kg m}^{-1} \text{ s}^{-1}$
- Week-3: Weekly probability values for *IVT proxy* $> 250 \text{ kg m}^{-1} \text{ s}^{-1}$

S2S AR Landfall Tool minus climatology

- Probability relative to MERRA climo

Experimental AR Forecasting Research Activity
sponsored by California DWR
Contact: J. Cordeira (jcordeira@ucsd.edu)



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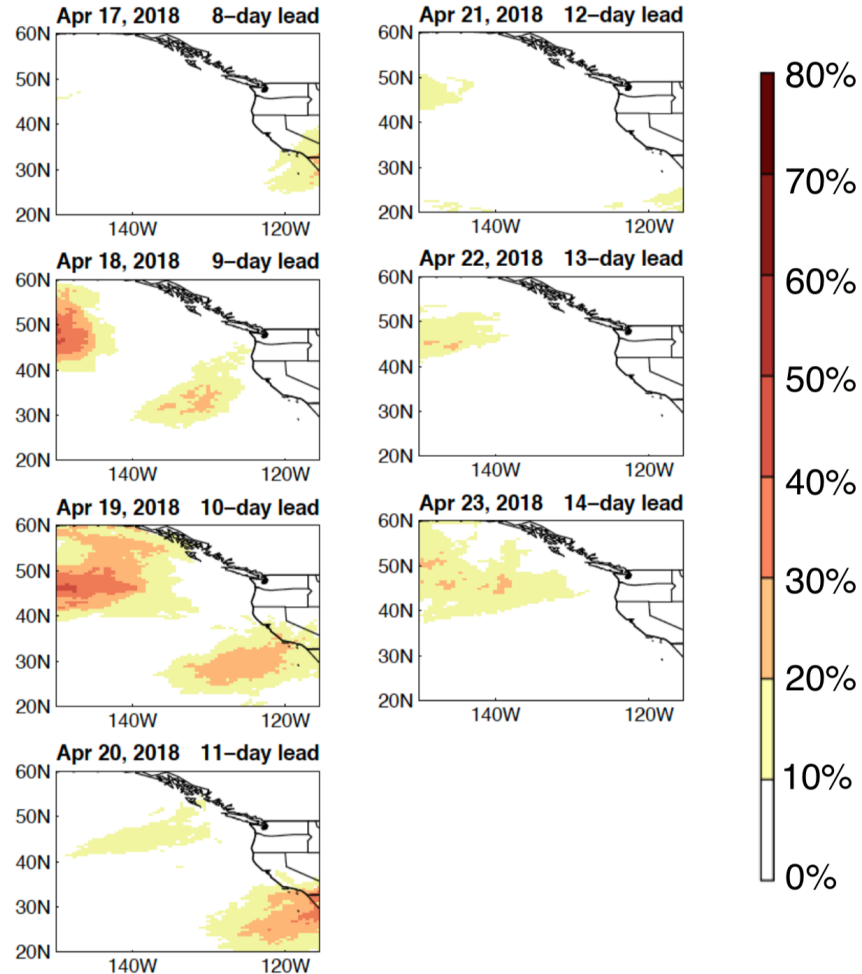
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Provided by J. Cordeira

AR Probability maps: week-2

EXPERIMENTAL AR FORECAST

April 9, 2018 forecast: probability of AR occurrence during week-2



Week-2 (8-day to 14-day lead)

ECMWF : 51 ensemble members

Experimental AR forecast issued on Monday, April 9, 2018 by M. DeFlorio, A. Goodman, D. Waliser, B. Guan, A. Subramanian, and M. Ralph using 51-member real-time ECMWF data for an Experimental AR Forecasting Research Activity sponsored by California DWR



Contact: M. DeFlorio
(michael.deflorio@jpl.nasa.gov)



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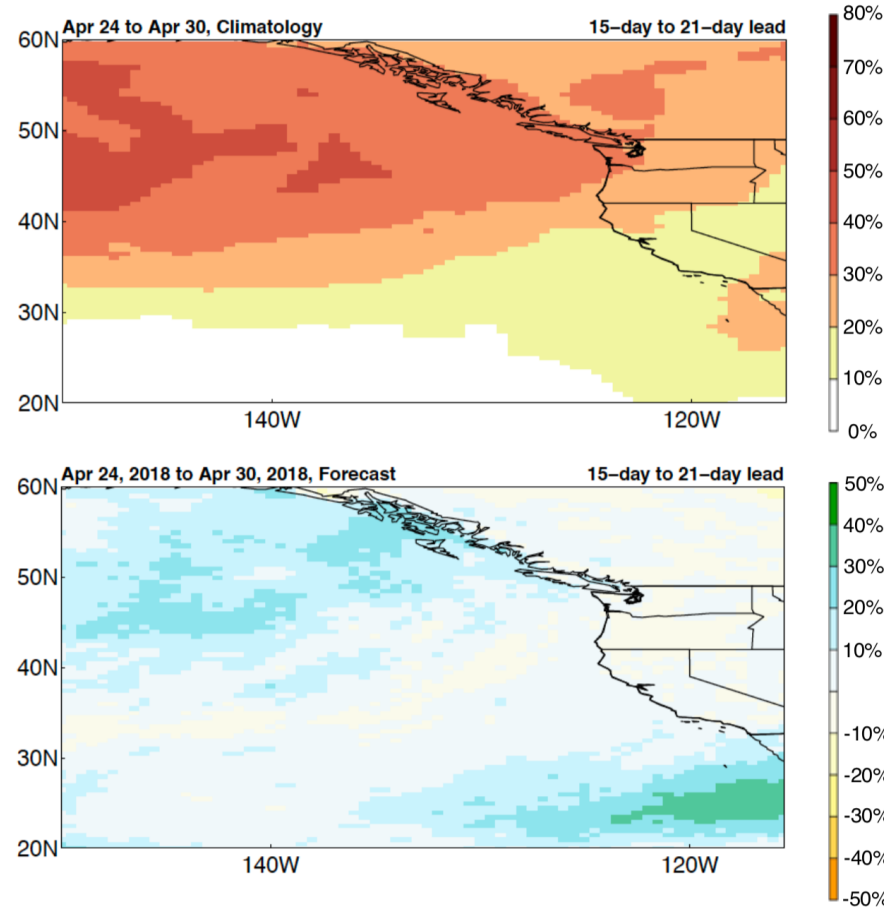
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AR Probability maps: week-3

EXPERIMENTAL AR FORECAST

April 9, 2018 forecast: probability of AR occurrence during week-3
(chance of an AR occurring **at any time** during week-3)



Week-3

(Combined 15-day to 21-day lead)

Top row: **hindcast climatology** (ECMWF 1996-2015 data)
Bottom row: **real-time forecast minus climatology** (ECMWF 51-member ensemble)

Experimental AR forecast issued on Monday, April 9, 2018 by M. DeFlorio, A. Goodman, D. Waliser, B. Guan, A. Subramanian, and M. Ralph using 51-member real-time ECMWF data for an **Experimental AR Forecasting Research Activity** sponsored by California DWR



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Contact: M. DeFlorio
(michael.deflorio@jpl.nasa.gov)



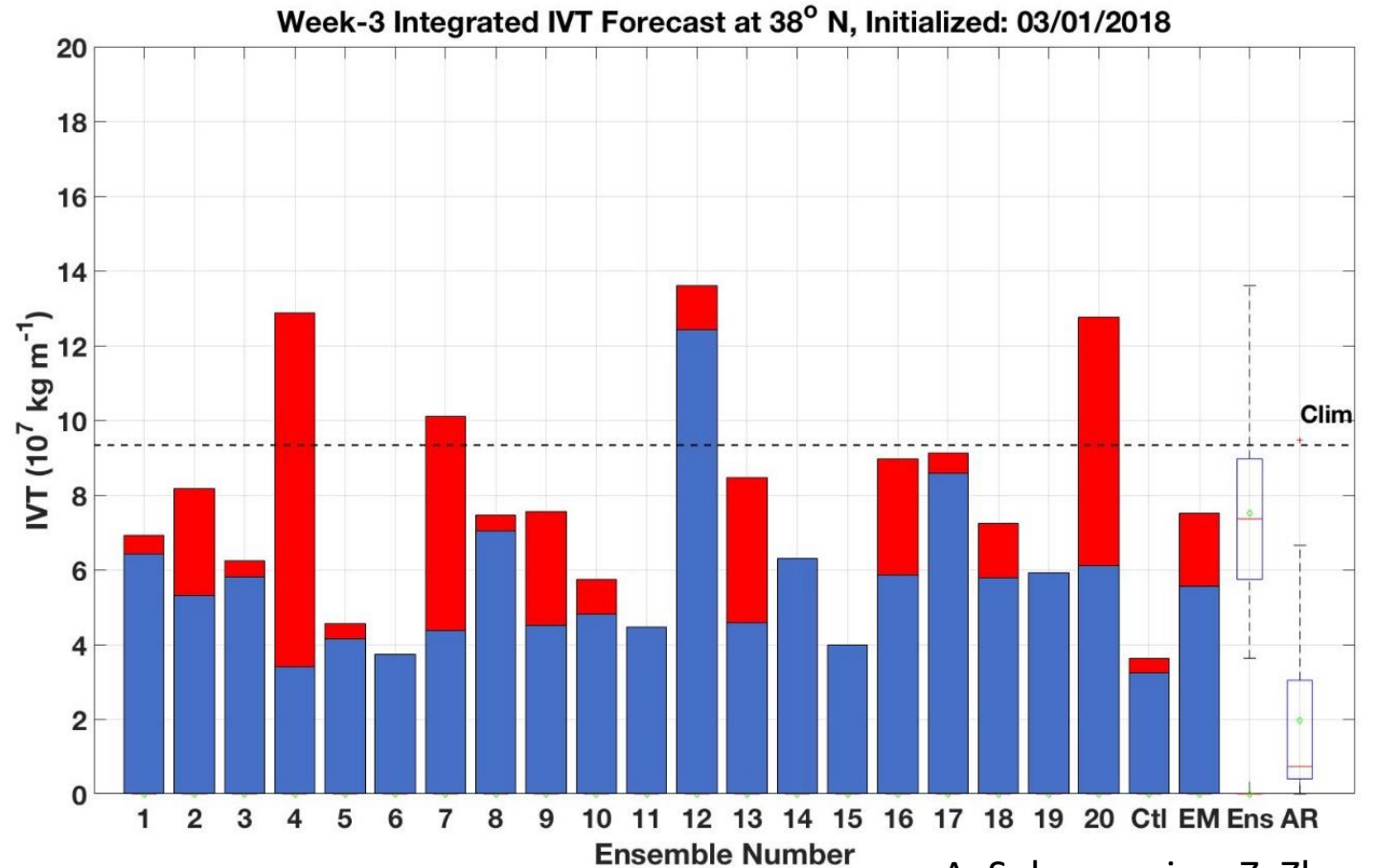
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Provided by A. Subramanian

Week-3 Integrated Vapor Transport

Env. Canada subseasonal forecast of IVT



A. Subramanian, Z. Zhang et al.



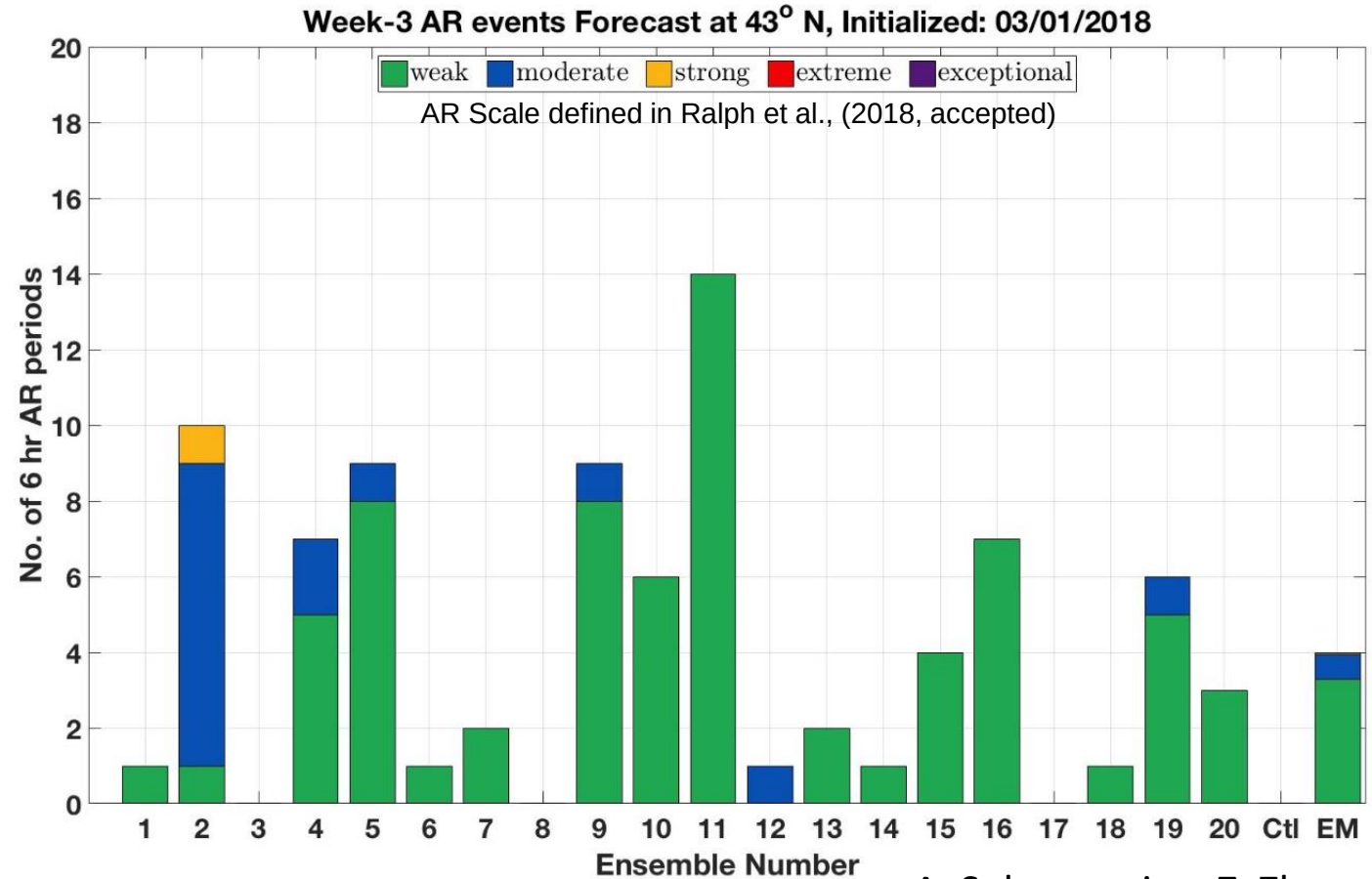
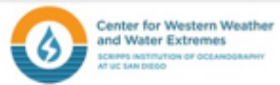
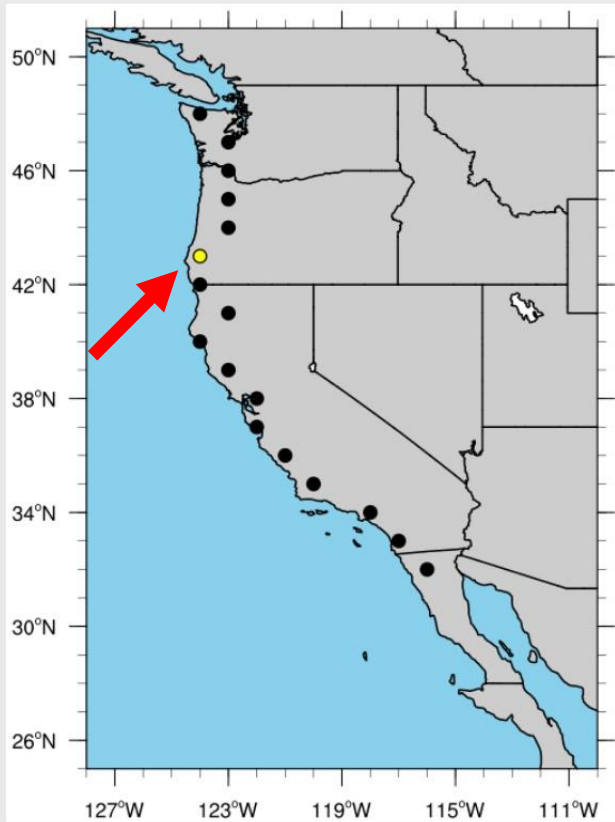
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Week-3 AR Activity (6 hr periods)

Env. Canada subseasonal forecast of ARs



A. Subramanian, Z. Zhang et al.



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Provided by A. Subramanian

Mundhenk et al. (2018) introduced an empirical model for predicting anomalous AR activity at S2S leads based on the phase of the MJO and QBO.

Results showed the potential for skillful “forecasts of opportunity” at leads greater 2 weeks, the point beyond which dynamical models provide little additional skill.

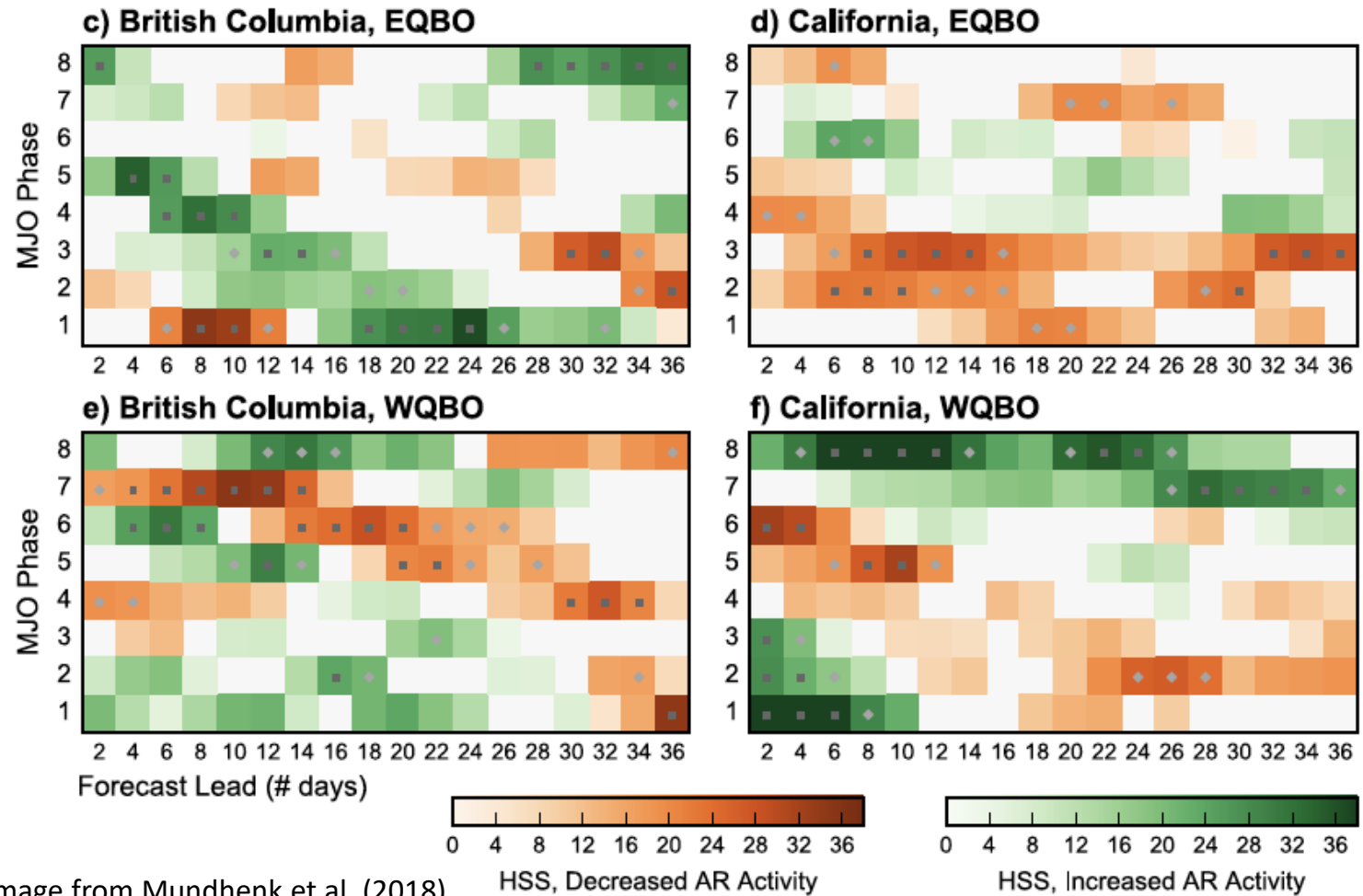


Image from Mundhenk et al. (2018)



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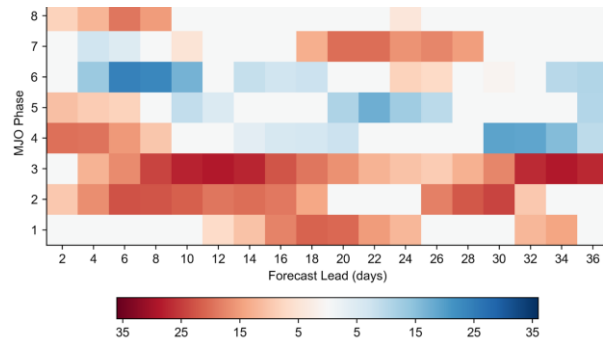
Provided by K. Nardi

The empirical model has been modified to forecast anomalous water vapor transport.

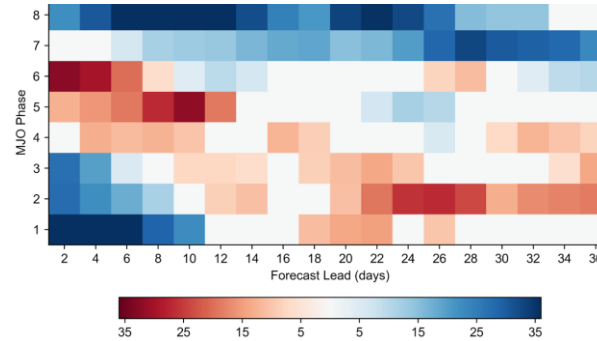
This model is also being modified to make precipitation forecasts.

AR
Counts

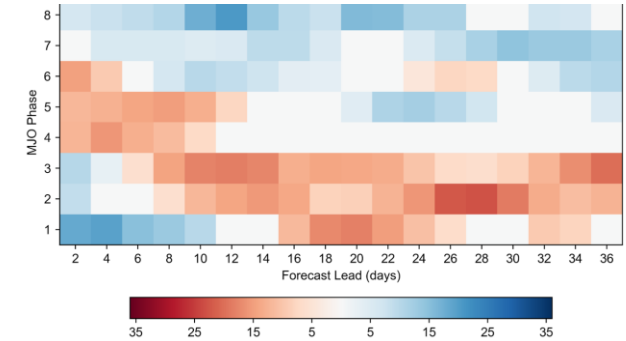
HSS for AR Count Forecasts
CA (EQBO)



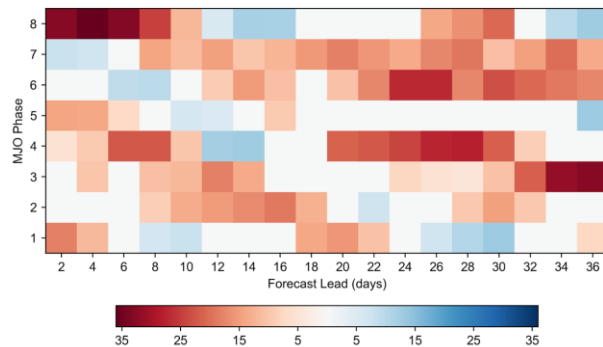
HSS for AR Count Forecasts
CA (EQBO)



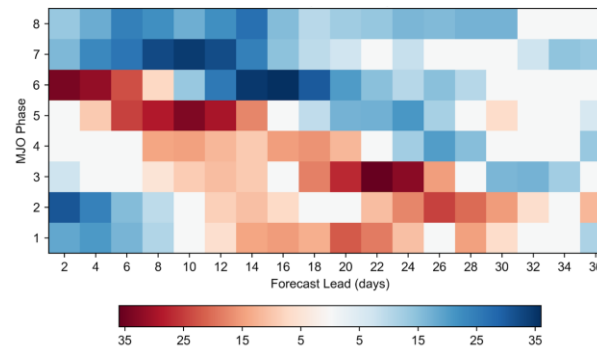
HSS for AR Count Forecasts
CA (QBO Independent)



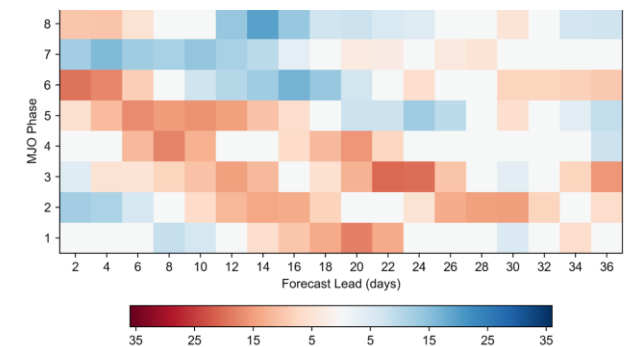
HSS for IVT Forecasts
CA (EQBO)



HSS for IVT Forecasts
CA (WQBO)



HSS for IVT Forecasts
CA (QBO Independent)



IVT



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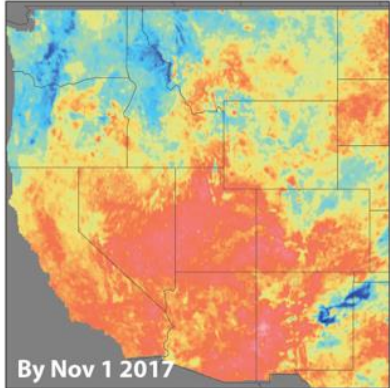
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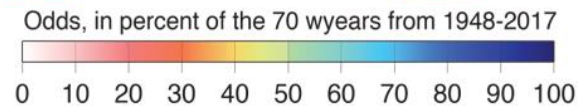
Odds of Reaching Water Year Normal

ODDS OF WY2018 REACHING 100% OF WATER-YEAR NORMAL PRECIPITATION TOTALS

[based on PRISM monthlies; normal = average of WY1981-2010]



Evolution of the 2018 water year in terms of the odds of reaching 100% of normal precipitation by the end of the water year (30 Sep, 2018)



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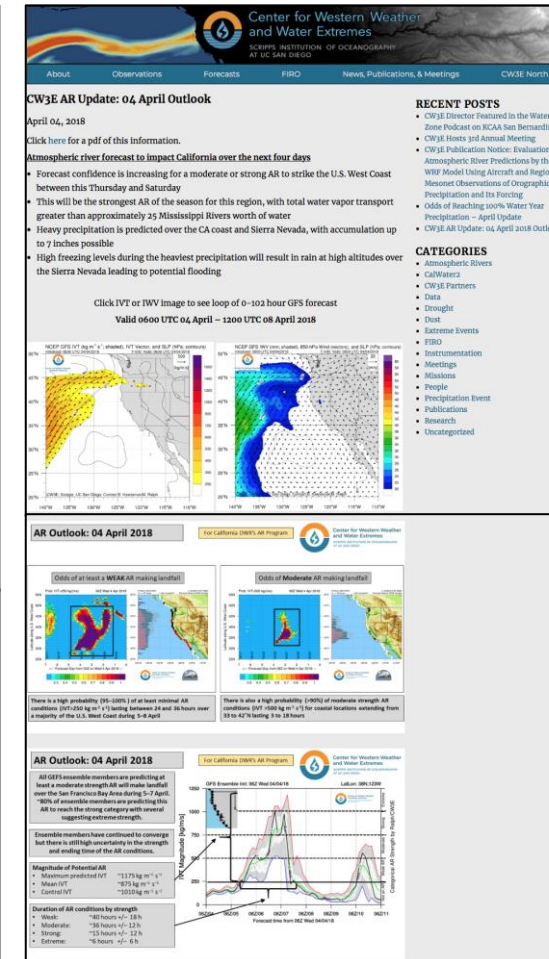
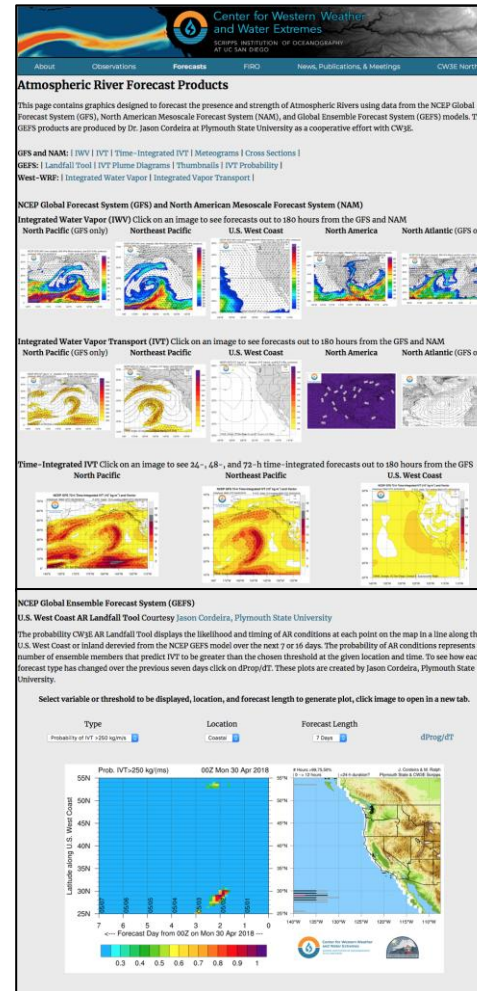
Figure from M. Dettinger

AR Forecasting at Short-Term Lead Times



AR Monitoring and Prediction Tools

- CW3E maintains a growing number of AR monitoring & prediction tools
- Expanding to include more **decision support tools**, interactive analyses and forecast, **watershed-scale tools**, pre-event outlooks, and post-event analyses
- Not just ARs



<http://cw3e.ucsd.edu>



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AR Monitoring and Prediction Tools

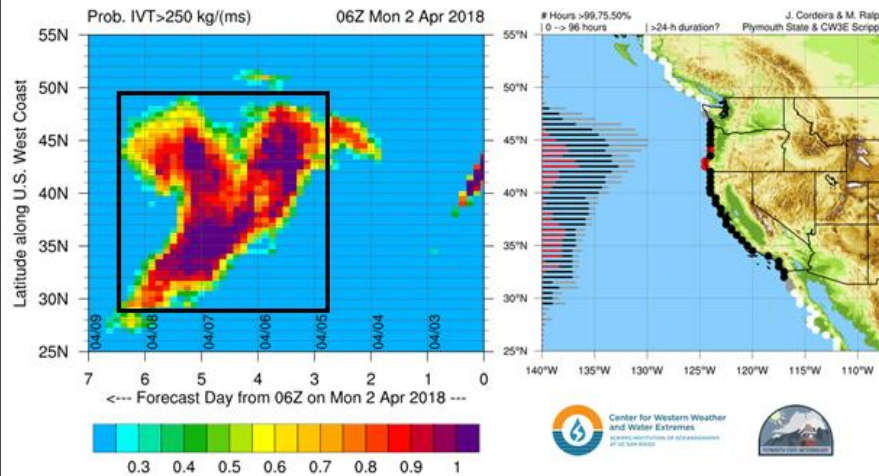
AR Outlook: 02 April 2018

For California DWR's AR Program



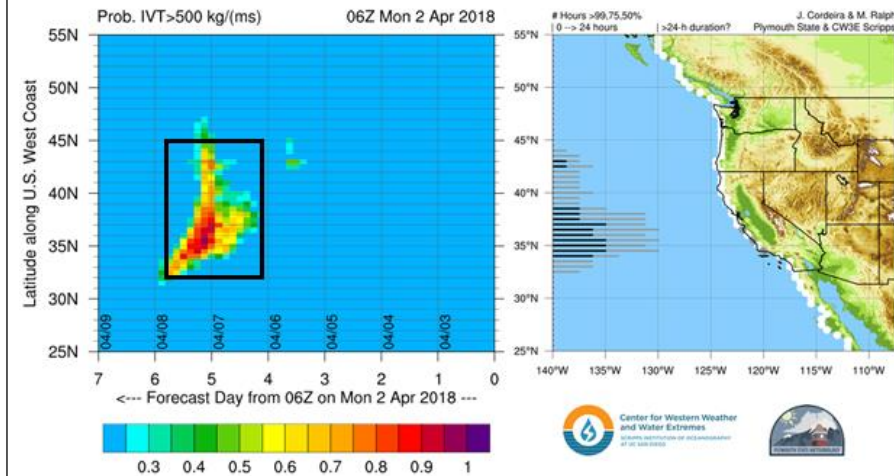
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Odds of at least a WEAK AR making landfall



- There is a high probability (95–100%) of AR conditions ($\text{IVT} > 250 \text{ kg m}^{-1} \text{ s}^{-1}$) lasting between 24 and 36 over a majority of the U.S. West Coast

Odds of Moderate AR making landfall



- There is also a high probability (~90%) of moderate strength AR conditions ($\text{IVT} > 500 \text{ kg m}^{-1} \text{ s}^{-1}$) for coastal locations extending from 34 to 39°N lasting 3 to 12 hours

Outlook by Hecht, Ralph, and Kawzenuk 2 April 2018



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Provided by J. Cordeira and F.M. Ralph

AR Monitoring and Prediction Tools

AR Outlook: 03 April 2018

There is high confidence that at least weak AR conditions will occur over the San Francisco Bay area for over 24 hours. Most ensemble members are suggesting this could be a strong AR with several forecasting for extreme conditions

While the ensemble members have converged over the past 24 hours the latest model run still shows uncertainty in the onset, duration, and magnitude of this AR

The control member has increased by $\sim 100 \text{ kg m}^{-1} \text{ s}^{-1}$ at this location since yesterday's update

Magnitude of Potential AR

- Maximum predicted IVT $\sim 1200 \text{ kg m}^{-1} \text{ s}^{-1}$
- Mean IVT $\sim 800 \text{ kg m}^{-1} \text{ s}^{-1}$
- Control IVT $\sim 1050 \text{ kg m}^{-1} \text{ s}^{-1}$

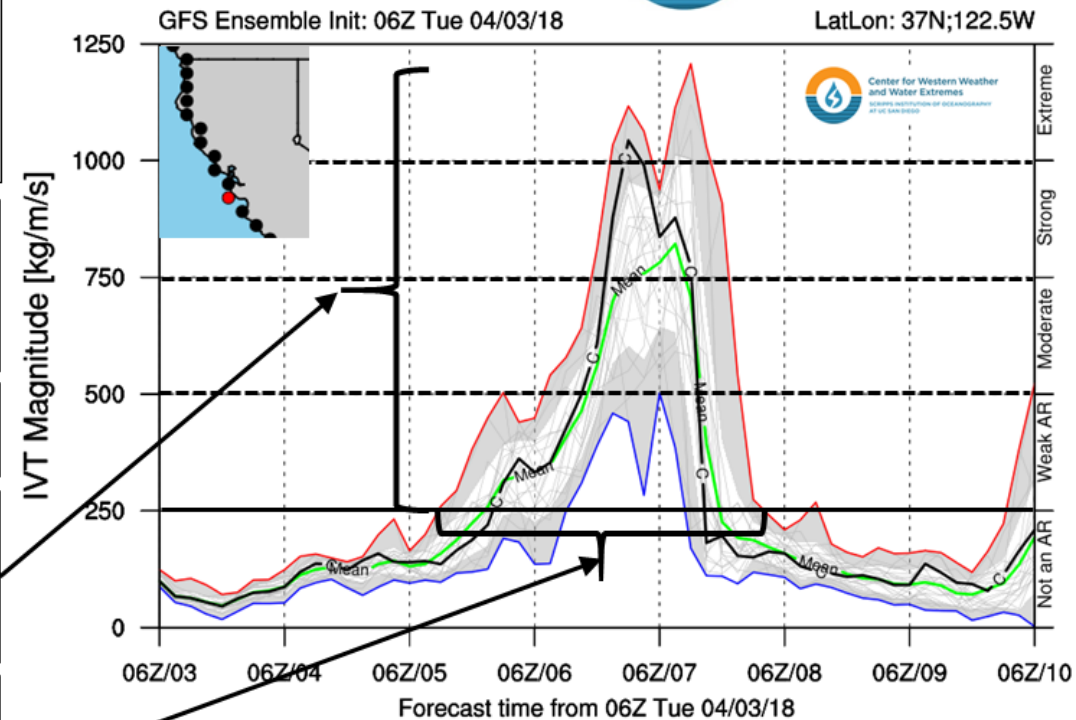
Duration of AR conditions by strength

- Weak: $\sim 36 \text{ hours} \pm 18 \text{ h}$
- Moderate: $\sim 24 \text{ hours} \pm 12 \text{ h}$
- Strong: $\sim 18 \text{ hours} \pm 12 \text{ h}$
- Extreme: $\sim 6 \text{ hours} \pm 6 \text{ h}$

For California DWR's AR Program



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Outlook by Kawzenuk, Ralph, and Hecht 3 April 2018

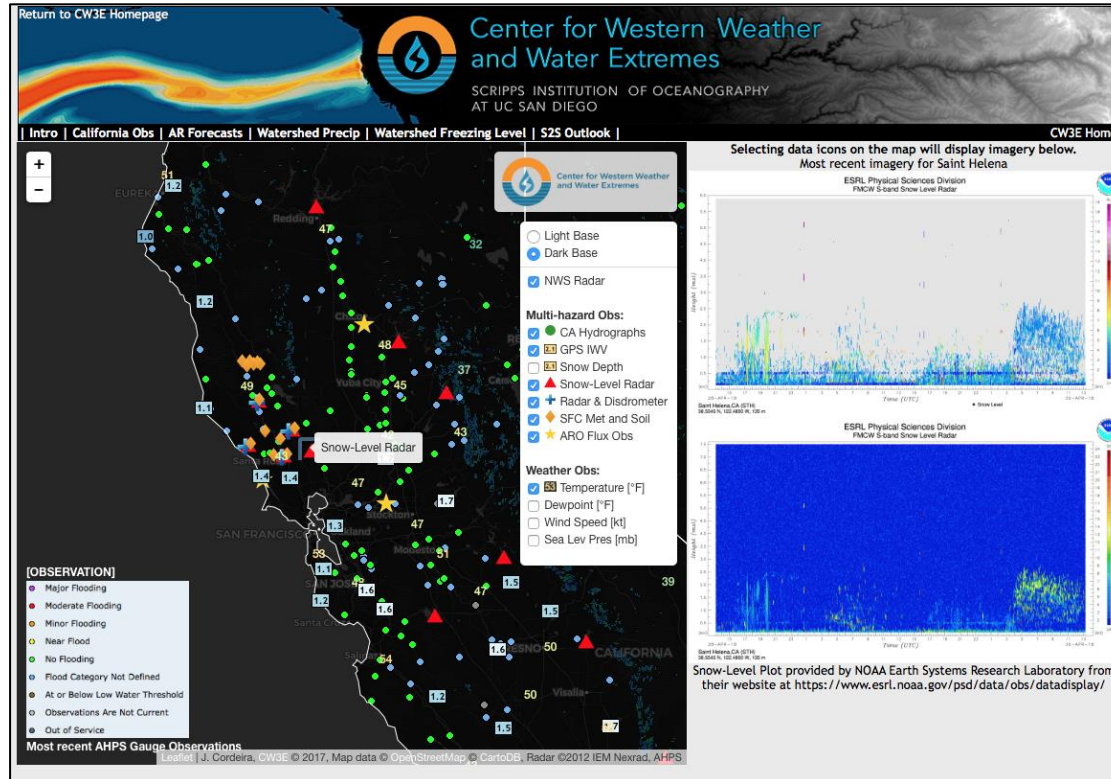


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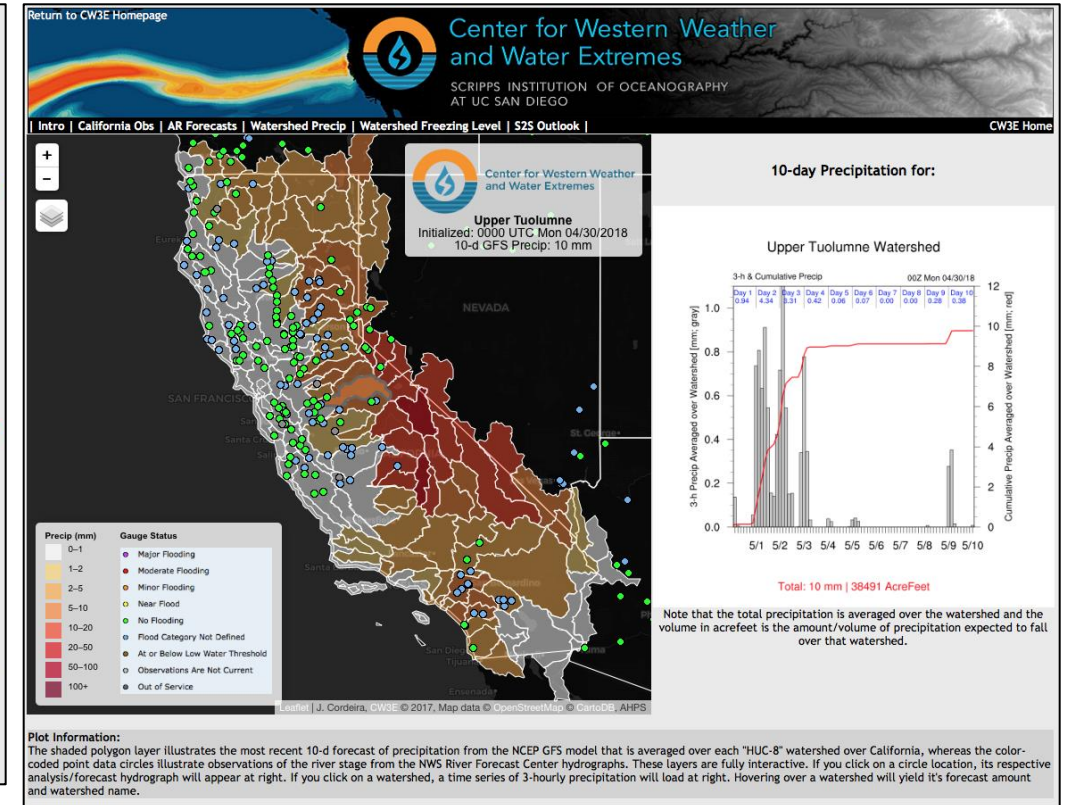
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AR Monitoring and Prediction Tools



Interactive 21st century California Observing Network data portal (data provided by multiple sources, including NOAA)



Interactive watershed-by-watershed GFS precipitation forecasts and NWS/CNRFRC hydrologic analyses

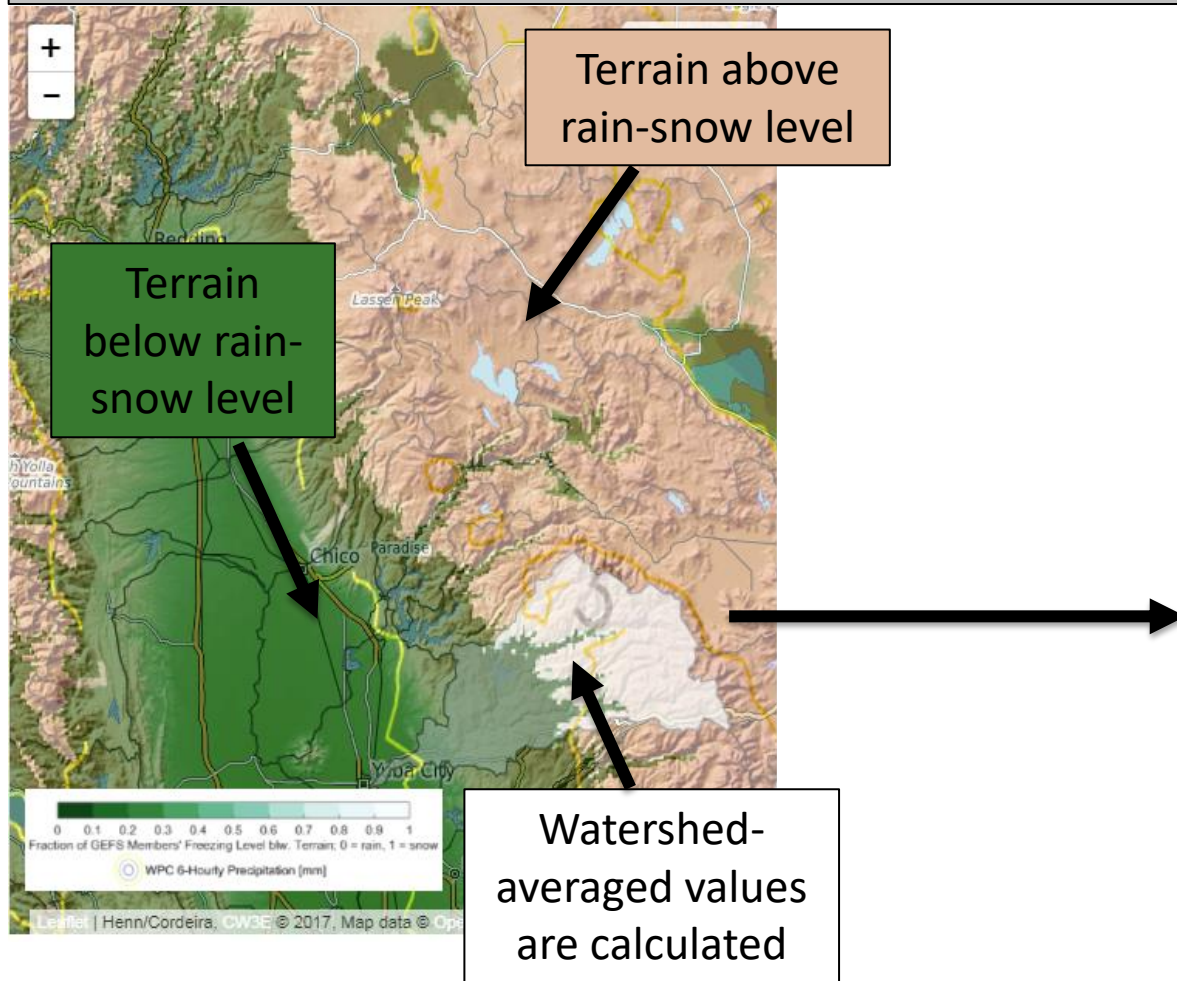


Center for Western Weather and Water Extremes

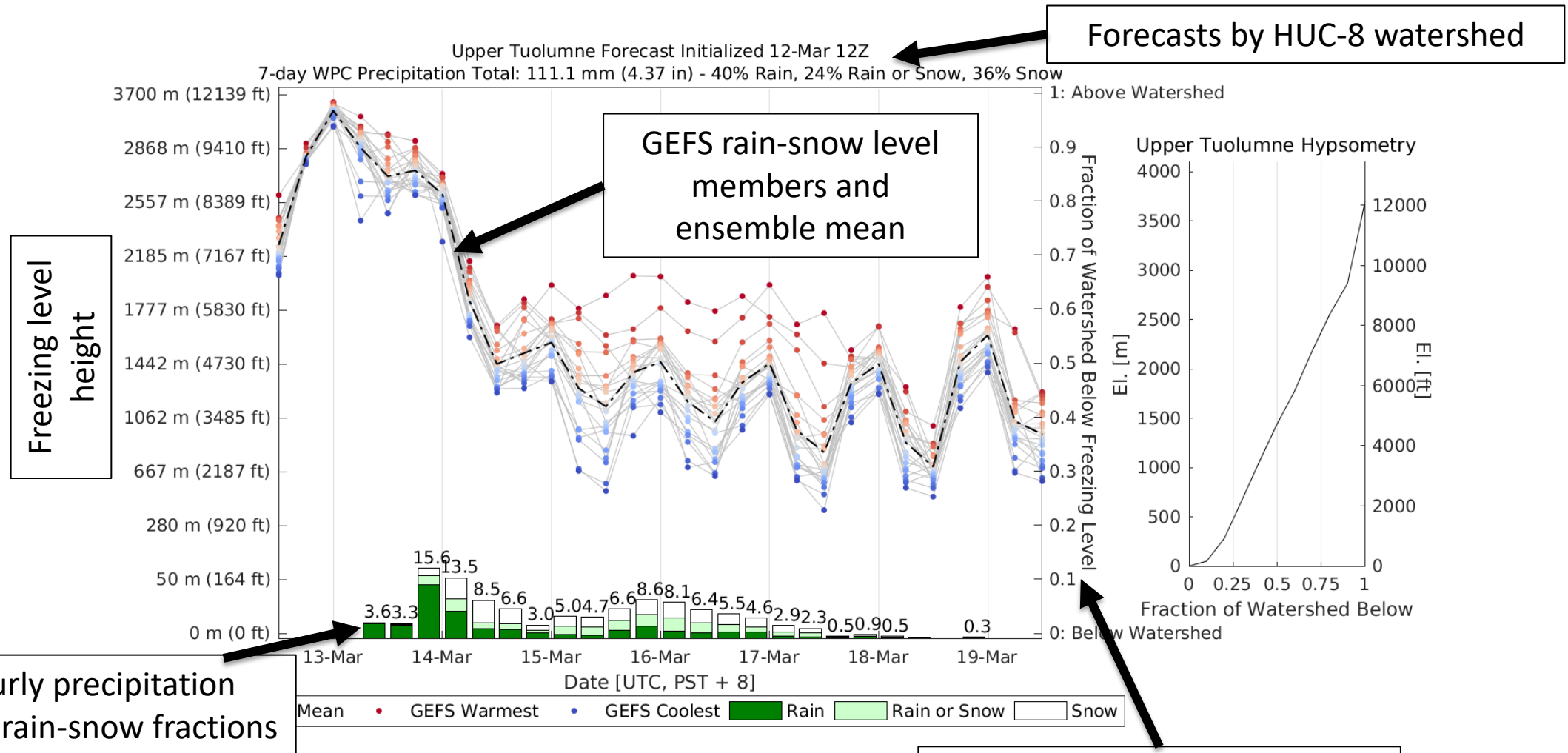
SCRIPPS INSTITUTION OF OCEANOGRAPHY
AT UC SAN DIEGO

Provided by J. Cordeira

AR Rain-Snow Forecast Tool



AR Rain-Snow Forecast Tool



Center for Western Weather
and Water Extremes

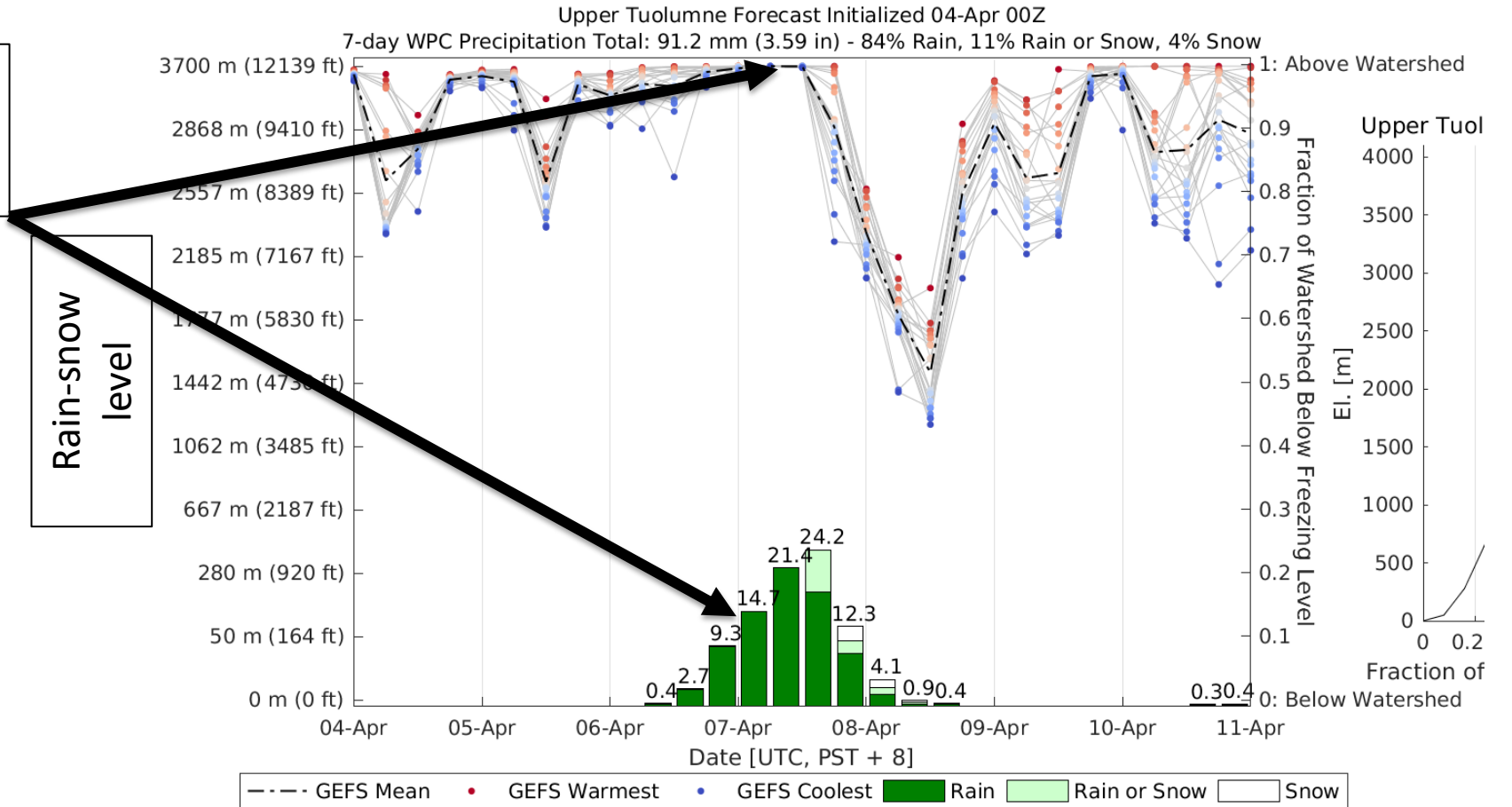
SCRIPPS INSTITUTION OF OCEANOGRAPHY
AT UC SAN DIEGO

Provided by
Brian Henn

Freezing level height expressed
as fraction of watershed below
rain-snow level

April 6-7 Atmospheric River Forecast

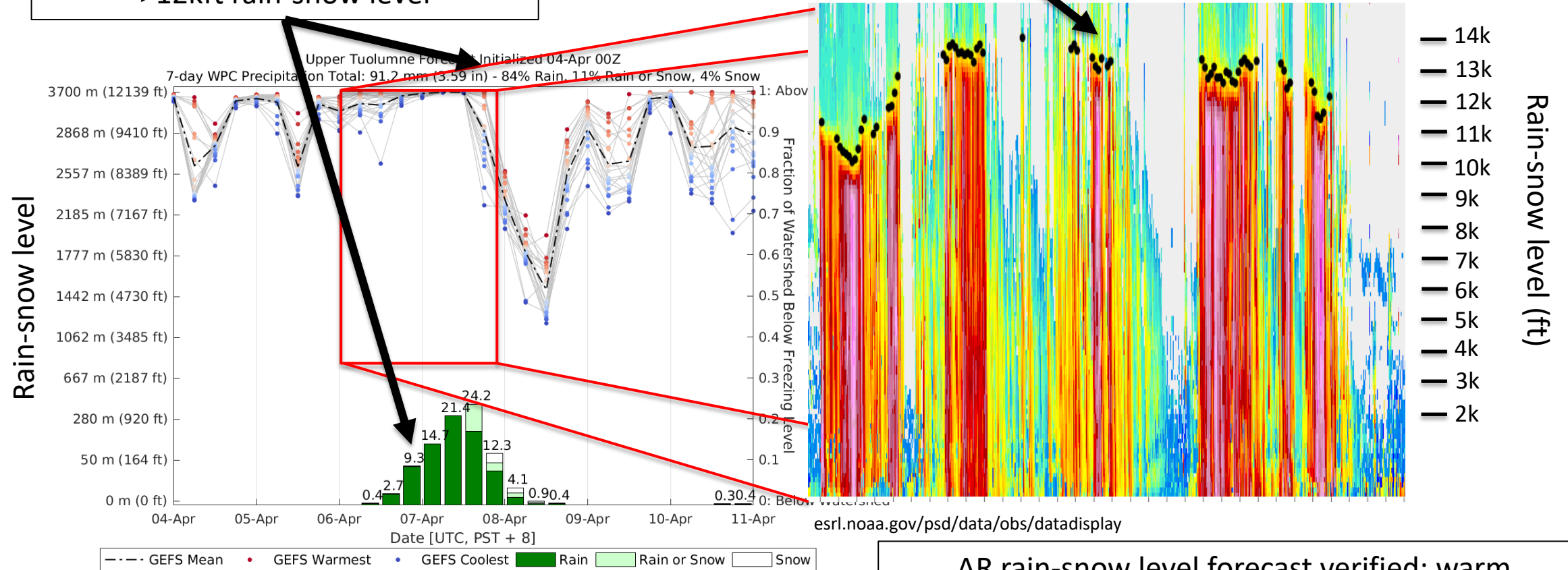
Forecast for warm AR with 4" precipitation in Sierra Nevada and >12kft rain-snow level



April 6-7 Atmospheric River Forecast

Forecast for warm AR with 4" precipitation in Sierra Nevada and >12kft rain-snow level

Observed rain-snow level nearly 13kft at New Exchequer radar



AR rain-snow level forecast verified; warm temperatures associated with heavy precipitation, snowmelt, and flooding in Sierra Nevada



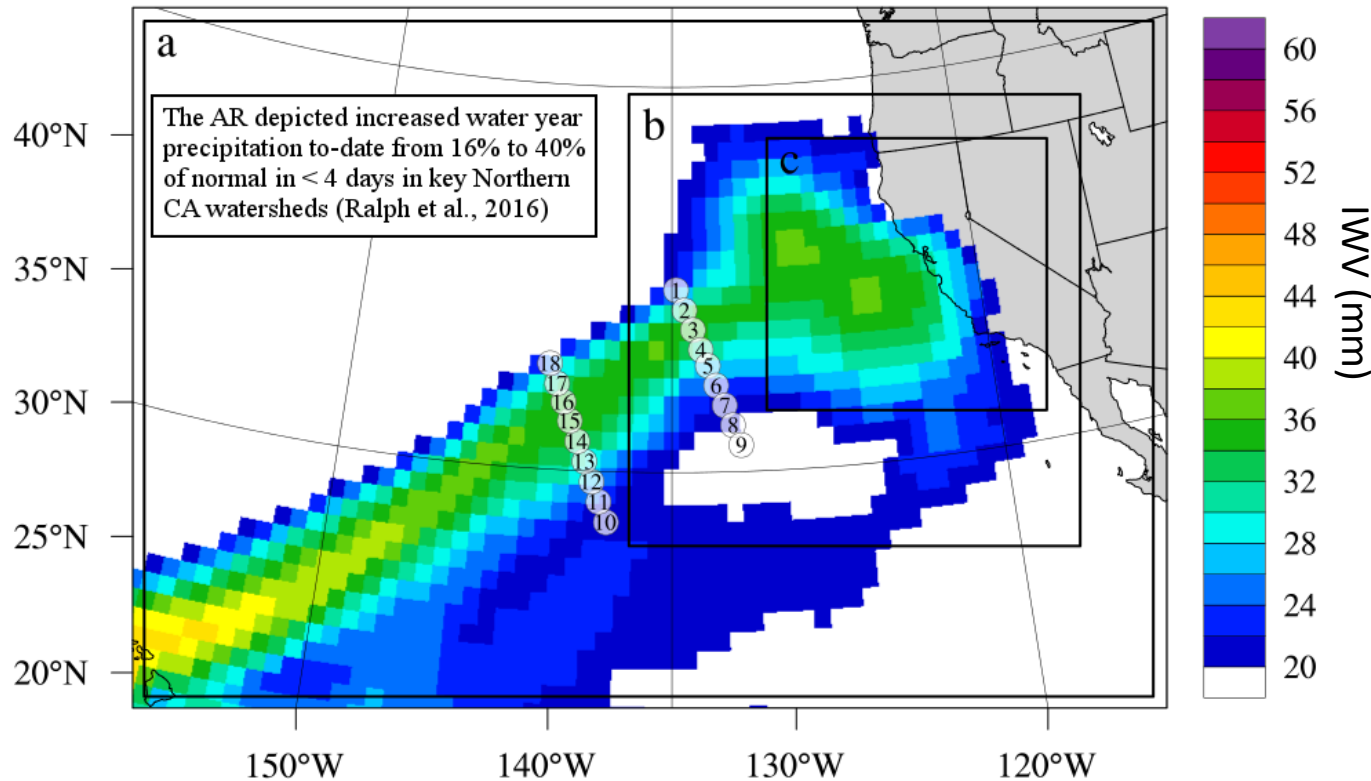
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and Water Extremes

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Provided by
Brian Henn

Evaluation of Atmospheric River Predictions by the WRF Model Using Aircraft and Regional Mesonet Observations of Orographic Precipitation and Its Forcing

Andrew Martin, F Martin Ralph, Reuben Demirdjian, Laurel DeHaan, Rachel Weihs, John Helly, David Reynolds, Sam Iacobellis. *Journal of Hydrometeorology*, <https://doi.org/10.1175/JHM-D-17-0098.1>



15 aircraft transects of AR were used to measure skill in West-WRF and GFS forecasts.

The data, comprising 191 dropsondes in total, were provided by the CalWater experiments of 2014-2015 (Ralph et al. 2016 *Bull. Amer. Meteor. Soc.*)



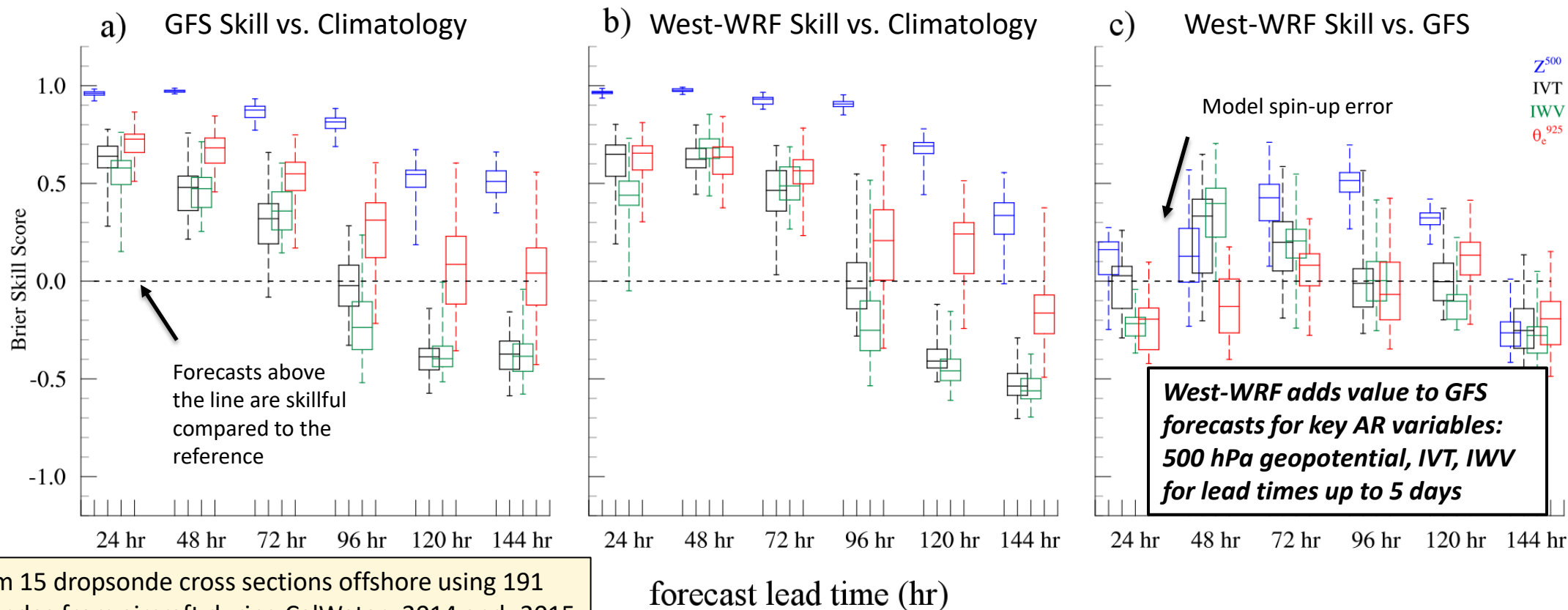
Center for Western Weather
and Water Extremes

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Martin et al., 2018

Evaluation of Atmospheric River Predictions by the WRF Model Using Aircraft and Regional Mesonet Observations of Orographic Precipitation and Its Forcing

Andrew Martin, F Martin Ralph, Reuben Demirdjian, Laurel DeHaan, Rachel Weihs, John Helly, David Reynolds, Sam Iacobellis. *Journal of Hydrometeorology*, <https://doi.org/10.1175/JHM-D-17-0098.1>



Martin et al., 2018



Center for Western Weather
and Water Extremes

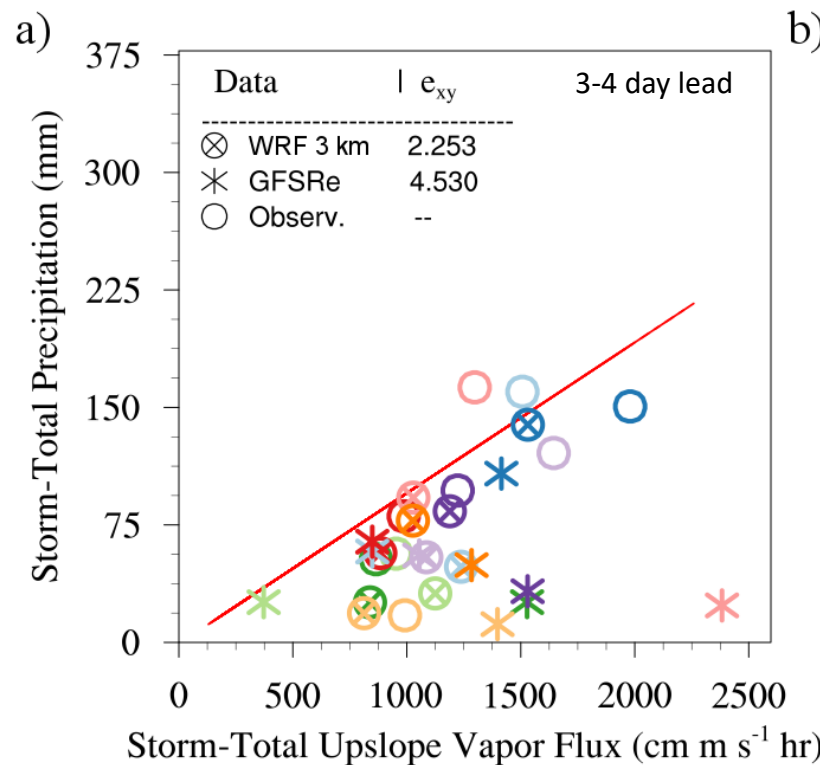
SCRIPPS INSTITUTION OF OCEANOGRAPHY
AT UC SAN DIEGO

Evaluation of Atmospheric River Predictions by the WRF Model Using Aircraft and Regional Mesonet Observations of Orographic Precipitation and Its Forcing

The simulated relationship between AR upslope-directed vapor flux and precipitation was compared to the observed relationship for 10 moderate AR between 2014-2016. GFS and West-WRF were evaluated.

This same evaluation has been made for other high-res models (e.g. NAM 3km and 12 km) for select recent AR. West-WRF consistently performs best at preserving this first-order driver of orographic precip.

West-WRF Forecasts are more skillful in orographic precipitation during landfalling AR



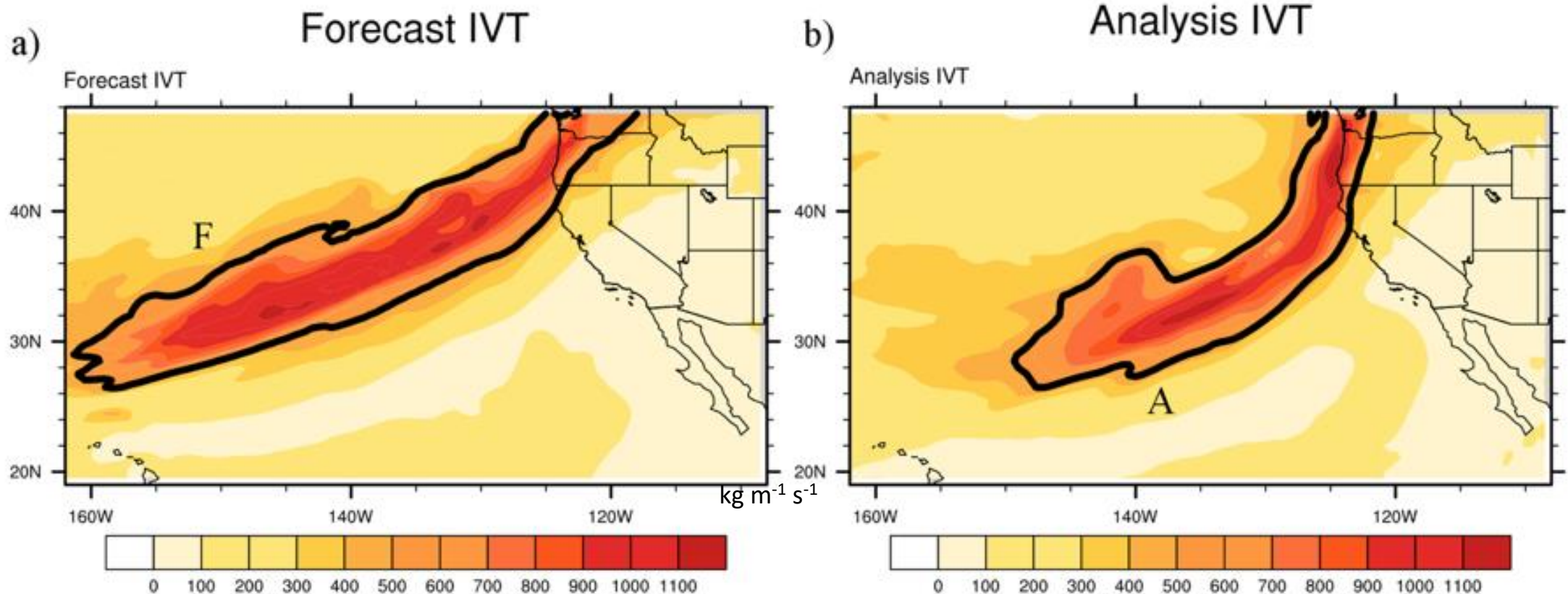
b)

Normalized Combined Error in Storm-Total Precipitation and Upslope Flux

Lead Time (days)	West-WRF	GFSRe
1 - 2	0.82	4.29
3 - 4	2.25	4.53
5 - 6	4.65	7.37

This, along with the previous finding, demonstrate that ***West-WRF better simulates AR properties offshore and the orographic component of precipitation onshore.***

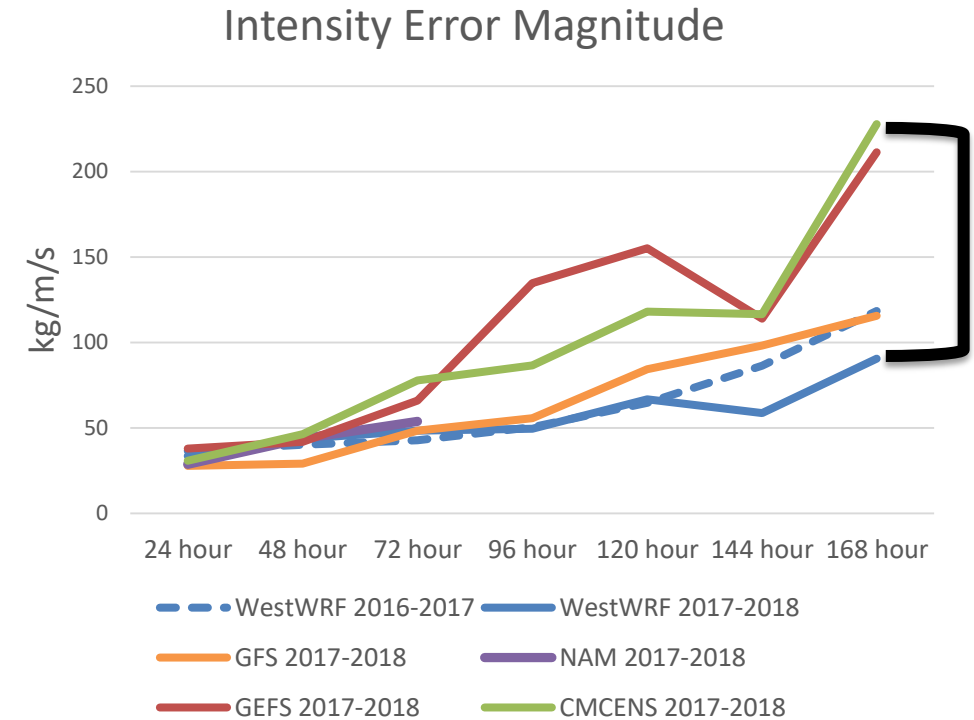
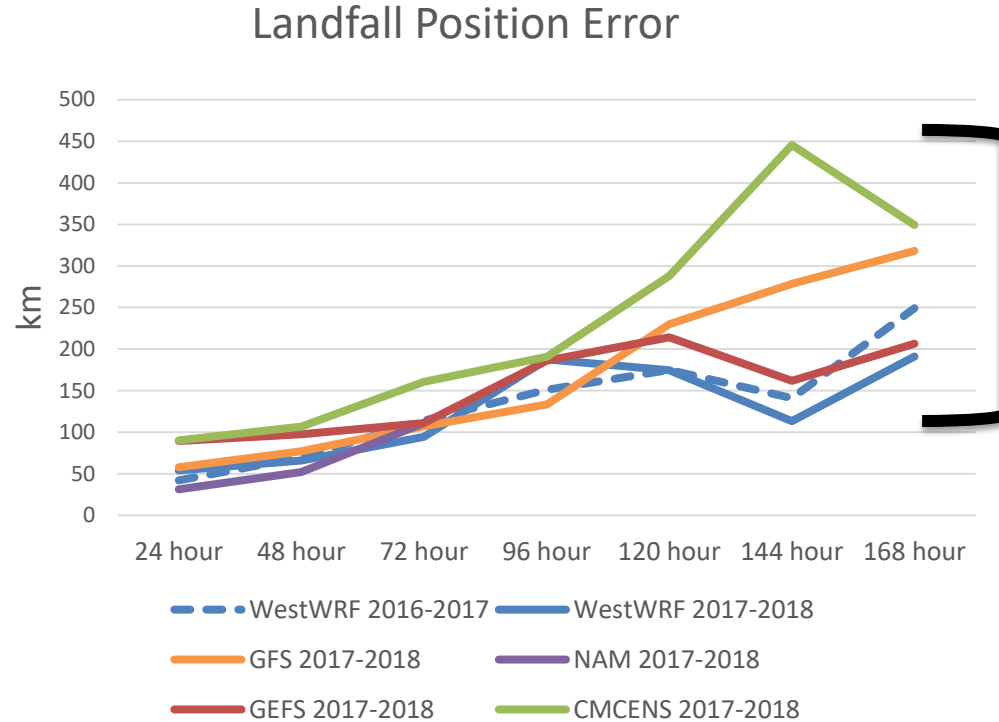
West-WRF Performance in AR Landfalls



- CW3E has implemented NCAR's MODE software to detect ARs as objects in NWP forecasts and analyses. An example of paired AR objects from a GFS forecast and analysis is above.
- Landfalling AR Forecast skill can then be measured and compared across models.
- For select models and recent AR events, the results are displayed in near-real-time at cw3e.ucsd.edu

West-WRF Performance in AR Landfalls

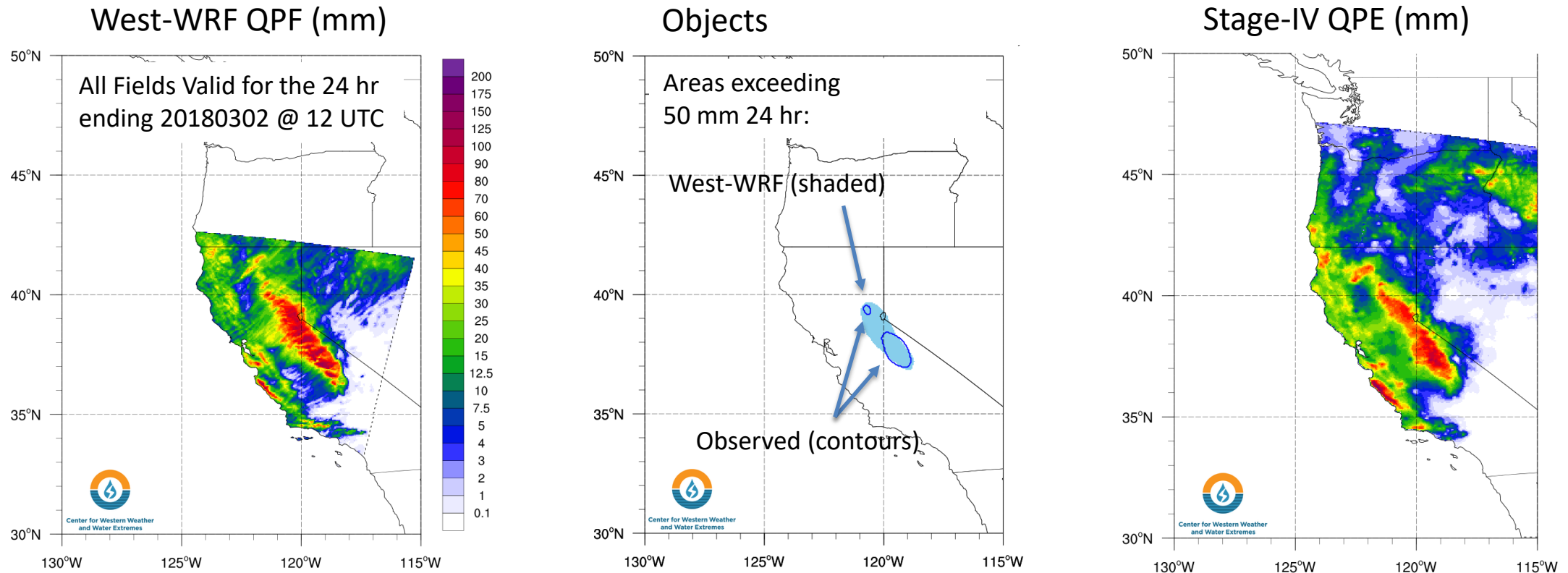
By error in landfall position and intensity at landfall, West-WRF outperforms the other models shown up to 7 days lead time.



- The MJO-based AR Landfall Verification has been used to measure forecast skill at a suite of models during WY 2018.
- These results, though preliminary, suggest that object-based verification may alleviate the phase error penalty imposed on high res. models by traditional point or grid-to-grid verification.



Object-Based Precipitation Verification



- CW3E is also using MODE to evaluate NWP precipitation forecasts during high-impact AR events.
- The above example shows the spatial relationship between 50 mm 24 hr⁻¹ precipitation forecasted by West-WRF and analyzed by WPC Stage-IV.
- Similar analysis for recent events and for other NWP models can be found at cw3e.ucsd.edu



AR Forecast Challenges at Short Lead Times

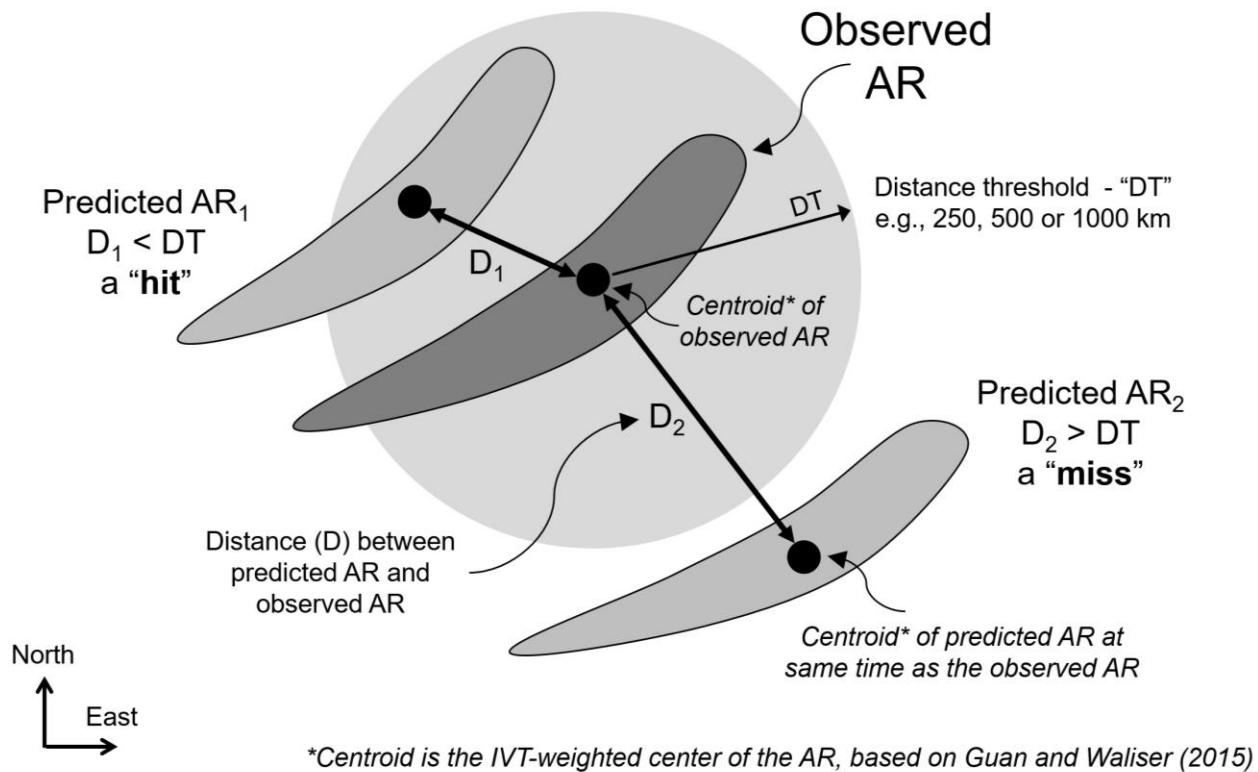


Global Assessment of Atmospheric River Prediction Skill

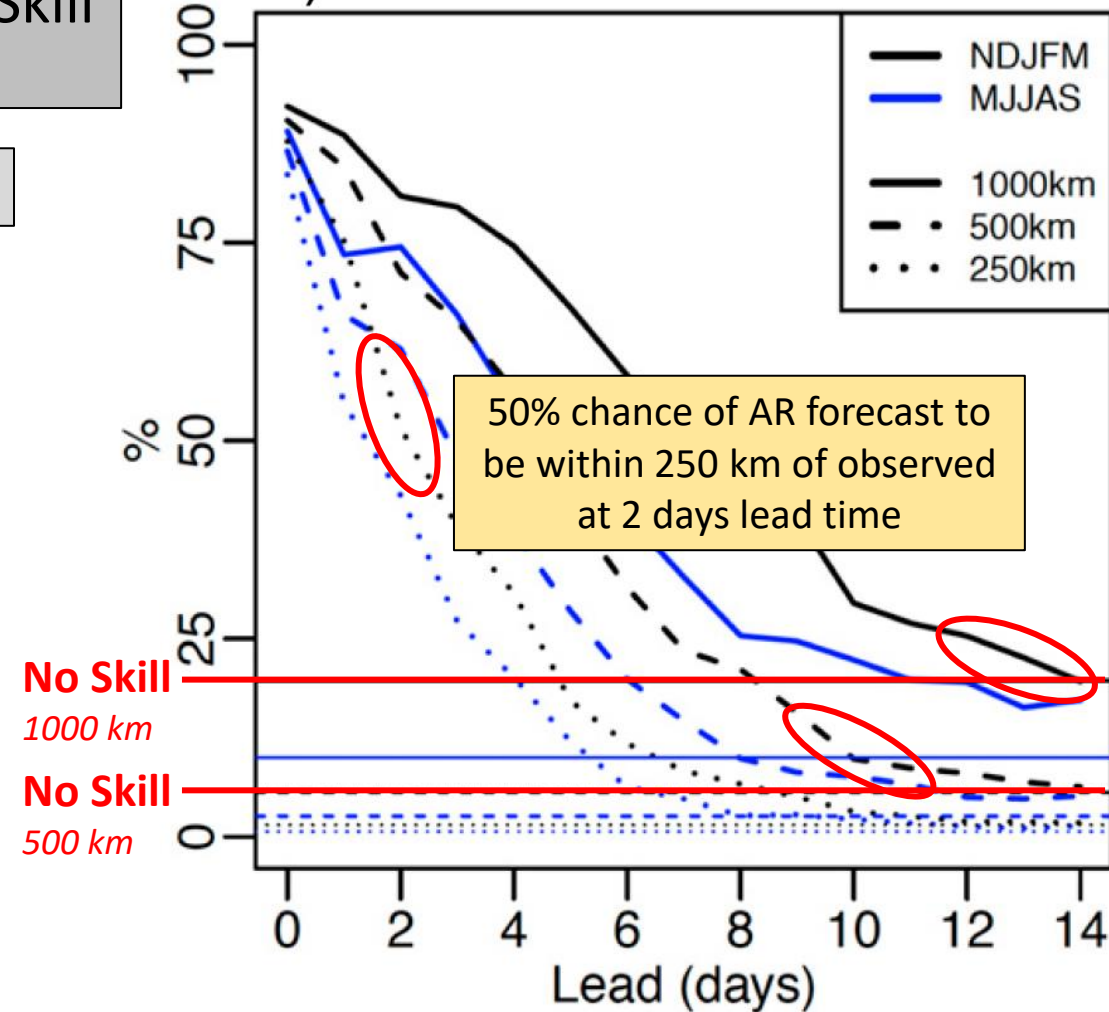
DeFlorio, Waliser, Guan, Lavers and Ralph (*JHM* 2018)

Uses ECMWF forecasts and Guana and Waliser (2015) AR Catalog

Method of determining if a predicted atmospheric river (AR) is a “hit” or a “miss” relative to an observed AR



a) NPac/Western US

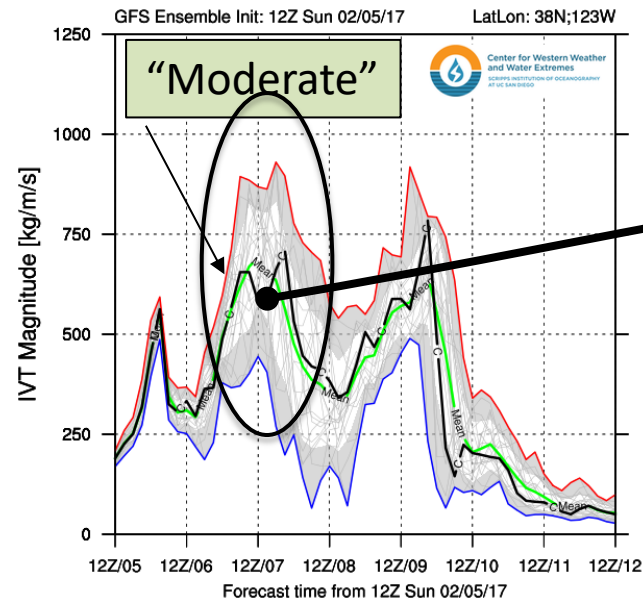


In Cool Season there is some AR forecast skill for 500 km distance threshold out to 10 days for 1000 km distance threshold out to 12 days

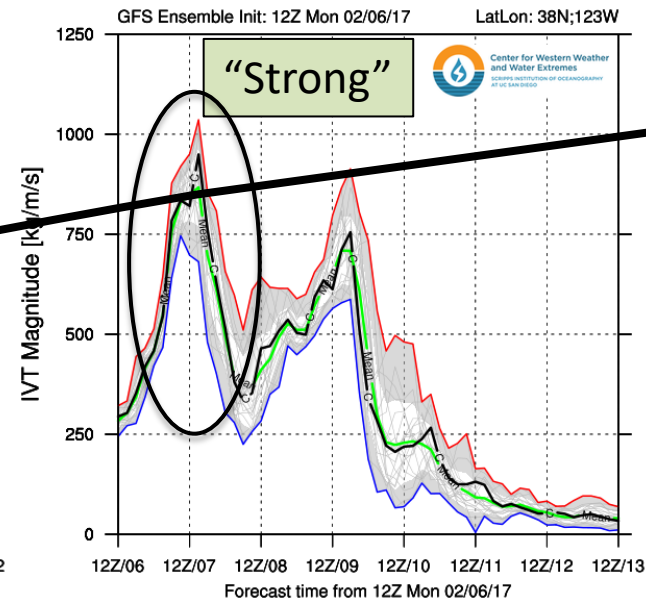
NCEP GEFS dProg/dt Example from February 2017 – “Oroville Case” (dam spillway issue)



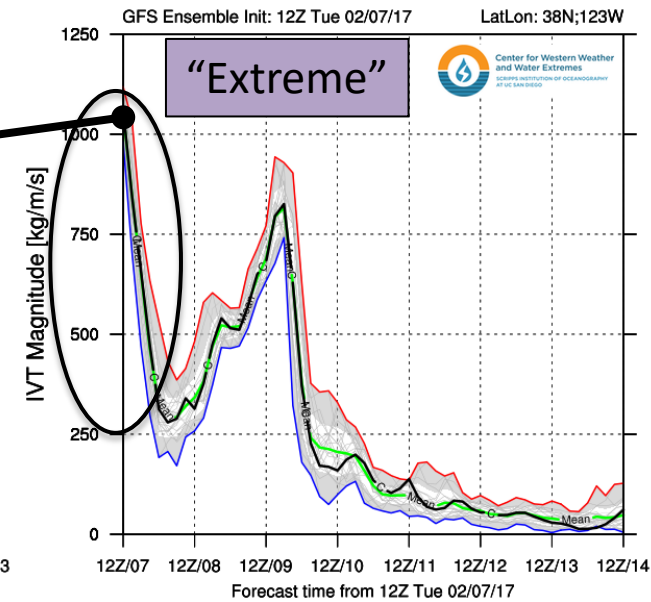
Oroville Dam Spillway
Damaged



Init: 12Z/5 Feb



Init: 12Z/6 Feb



Init: 12Z/7 Feb

Image Description: 7-day forecasts of the NCEP GEFS IVT [$\text{kg m}^{-1} \text{s}^{-1}$] at 38N, 123W. The following is indicated at each forecast time: ensemble member maximum (red), ensemble member minimum (blue), ensemble mean (green), ensemble control (black), ensemble standard deviation (white shading), and each individual member (thin gray). Time advances from left to right.

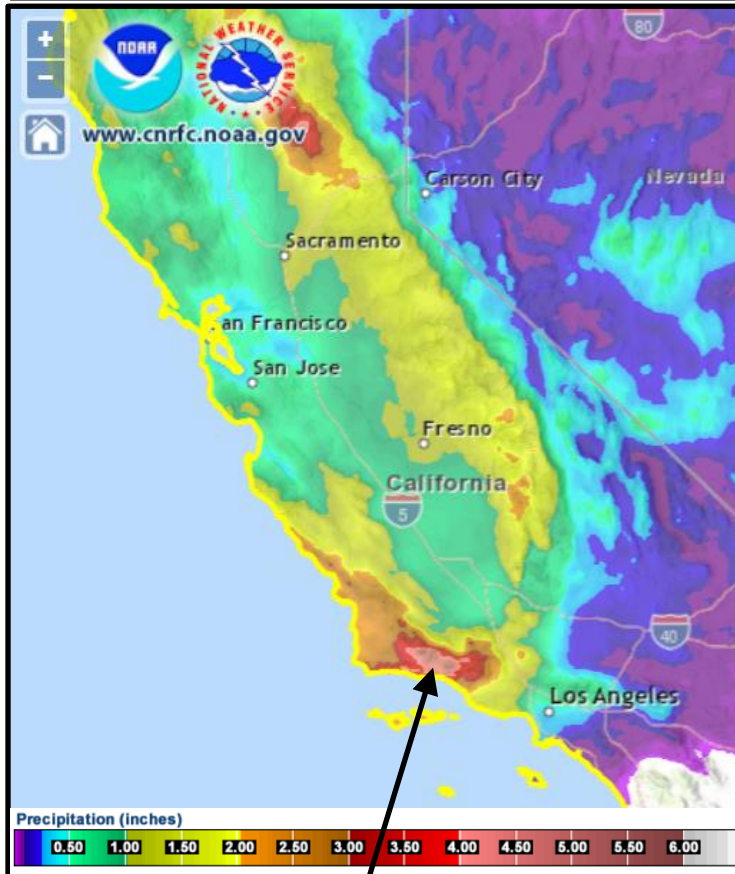
Key: Variability in north-south shift of ARs result in increases or decreases in IVT magnitude at the coast. In this case the ARs ultimately ended up **stronger**.



AR Outlook: 22 March 2018

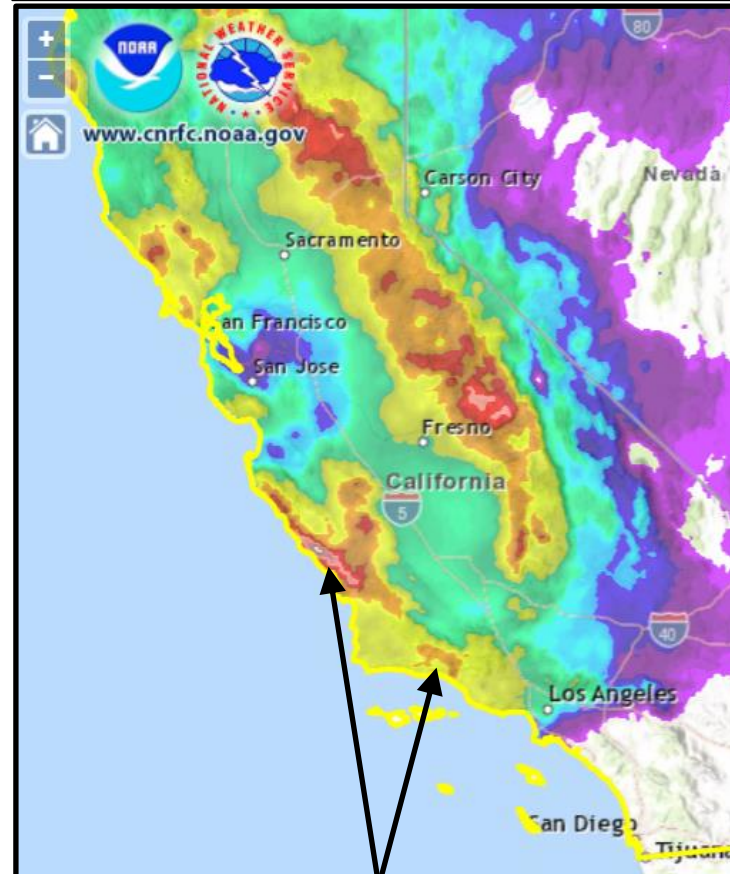


CNRFC 24-hr QPF issued 20 March valid 5 AM PDT
21 to 5 AM 22 March 2018



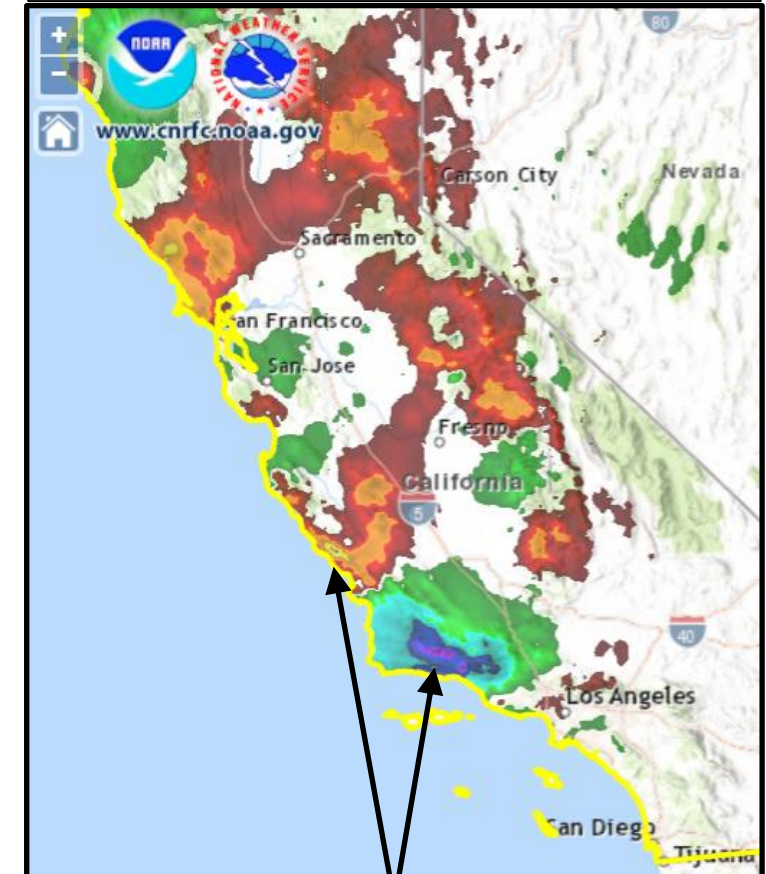
The 24-hr accumulated precipitation forecast for the period ending at 5 am PDT 22 March had a maximum accumulation of

CNRFC 24-hr QPE valid 5 AM PDT 21 to 5 AM 22
March 2018



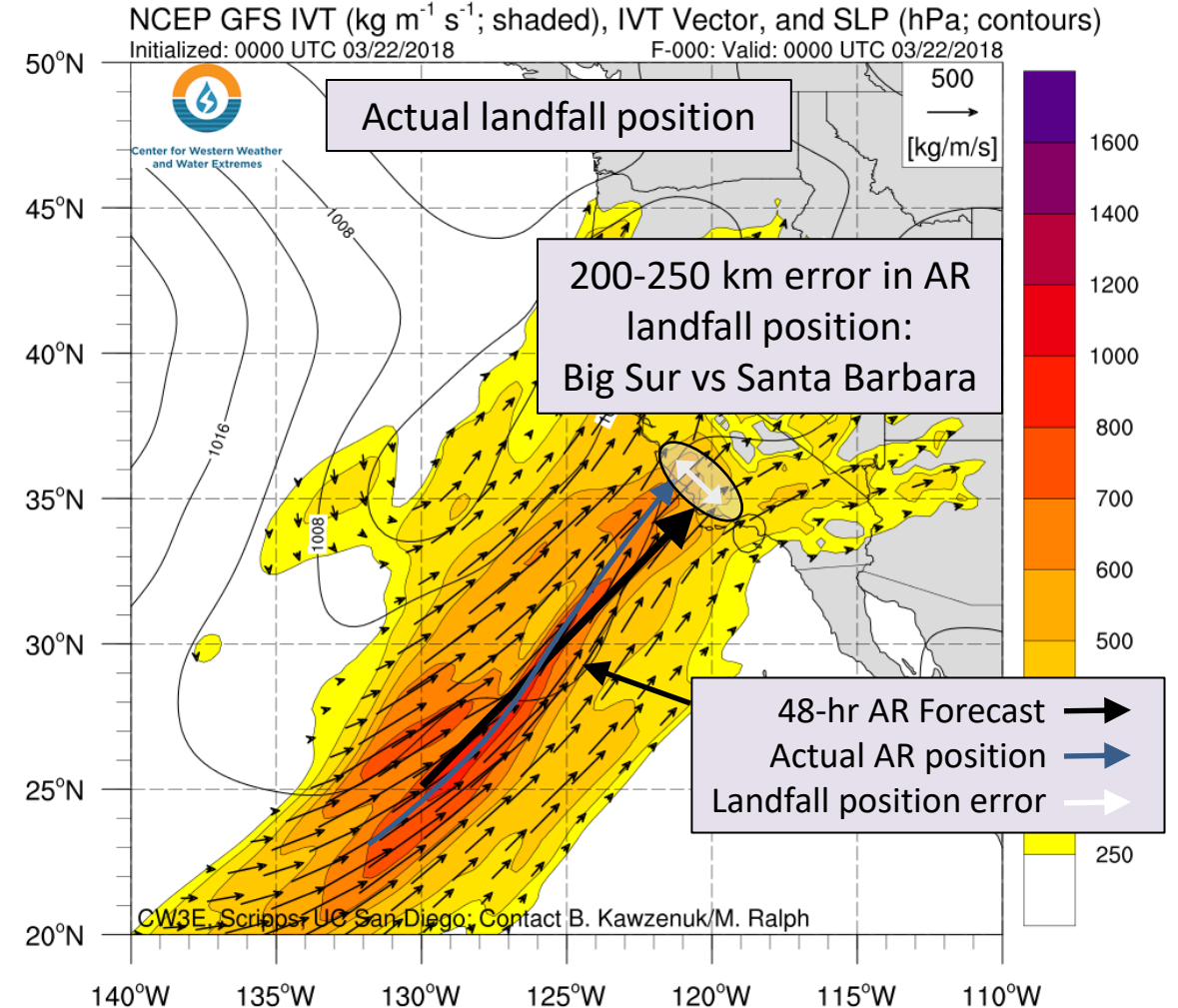
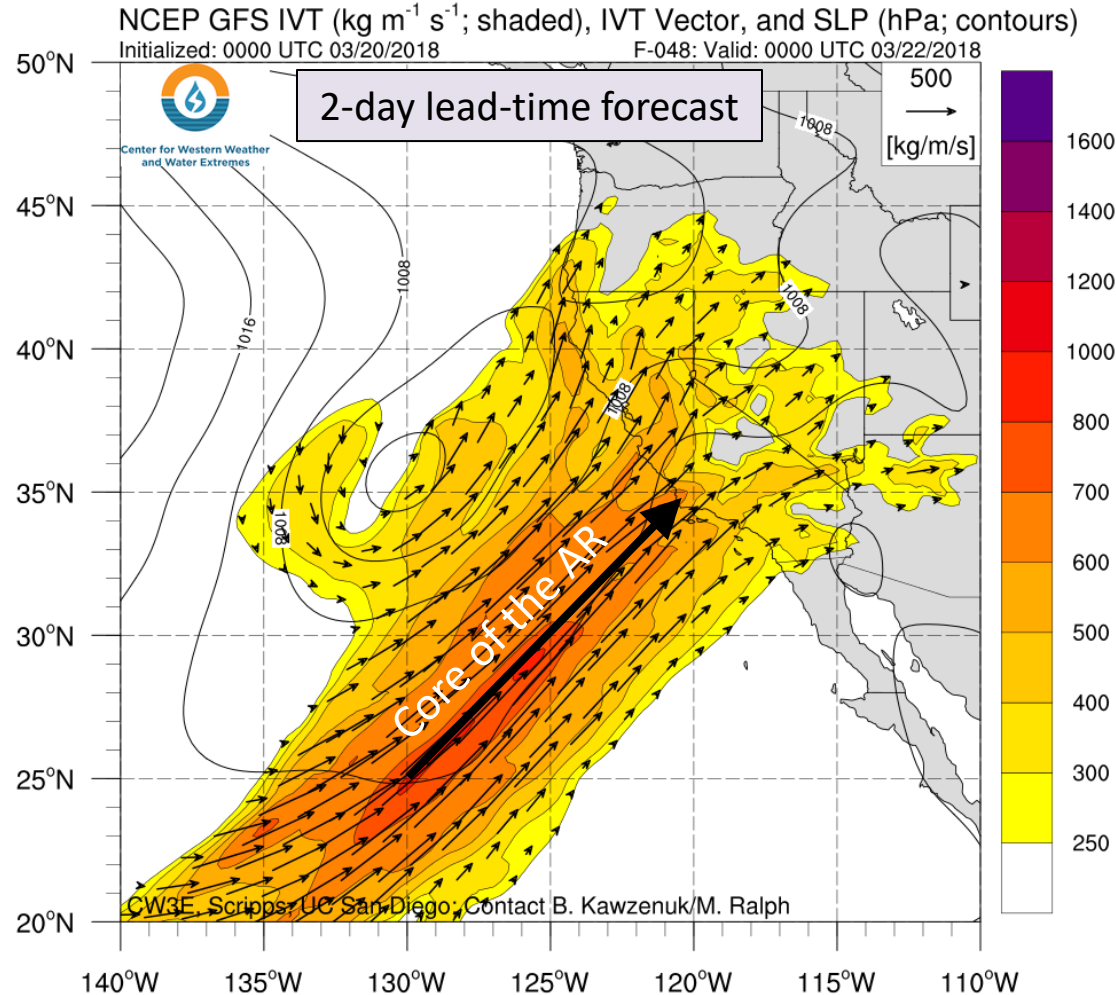
The 24-hr quantitative precipitation estimate (QPE) indicated that ~6 inches fell along the Coastal Mts. and ~2 inches fell over the Santa Ynez Mts.

CNRFC 24-hr Verification (QPF-QPE)
Valid 5 AM PDT 21 to 22 March 2018



The QPE accumulations resulted in a over forecast of ~3 in. over the Santa Ynez Mts. and an under forecast of ~3 in. over Big Sur

AR Outlook: 22 March 2018



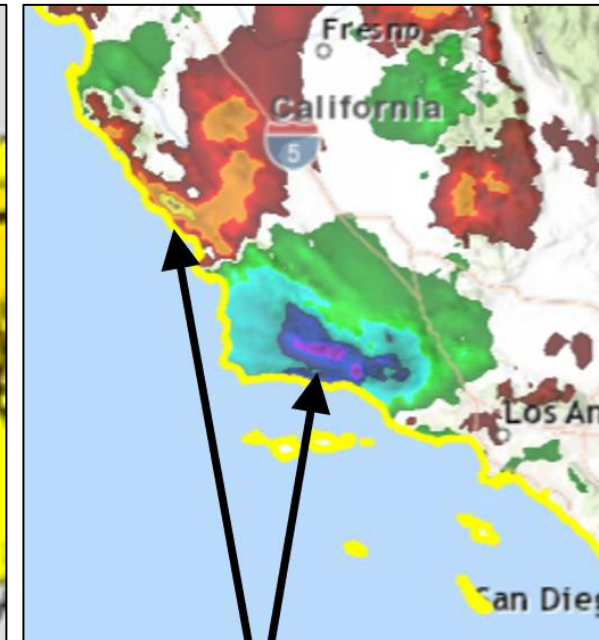
- The errors in the precipitation forecasts were partly driven by errors in weather model forecast of AR landfall location
- The forecast issued at 5 PM PT on Mon. 19 March predicted that the core of the AR 2 days later would be located just west of Santa Barbara at 5 PM PT Wed. 21 March, and would have produced up to 10 inches of rain in the mountains above Santa Barbara
- However, the observations (GFA analysis) showed that the core of the AR was instead over Big Sur (~200-250 km from the predicted position). Big Sur did receive up to 9-10 inches of rain, while mountains above Santa Barbara 4-5 inches



Big Sur
*Observed
Max AR rainfall*

**200-250 km
landfall position
forecast error**

Santa Barbara
*Predicted Max
AR rainfall*



Precipitation forecast error
pattern was a dipole,
representing mostly a
position error in the location
of the heavy precipitation

AR Summary: 23 March 2018

GFS 0-hr Analysis (Top: IVT, bottom: IWV)



F. M. Ralph, C. Hecht

12 UTC 21 Mar

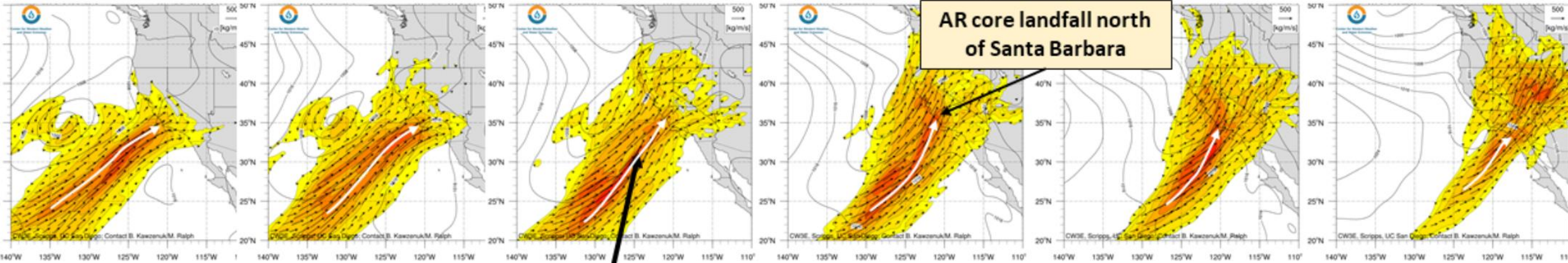
18 UTC 21 Mar

00 UTC 22 Mar

06 UTC 22 Mar

12 UTC 22 Mar

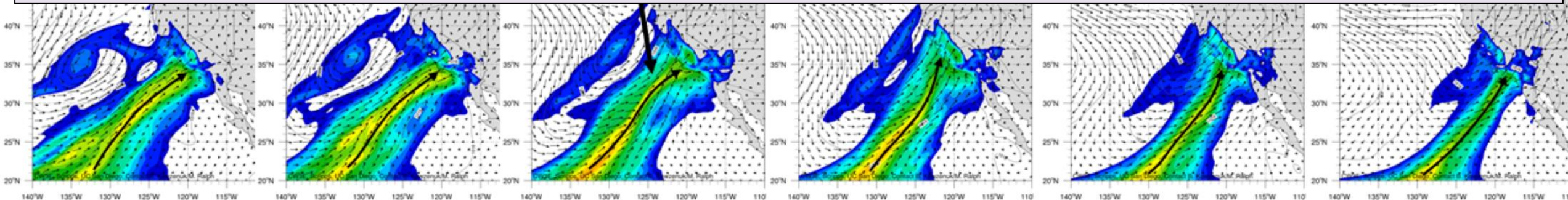
18 UTC 22 Mar



Around 00 UTC 22 March a wave occurred in the AR which changed the orientation to be more southerly and propagated the IWV and IVT further north than expected.

This wave was not well forecasted and resulted in the AR core making landfall about 200-250 km further north than expected. This most likely lead to the precipitation forecast errors over Santa Barbara and Big Sur shown in yesterday's update.

Mesoscale Frontal Wave was key source of AR landfall position error



Airborne AR Recon



Center for Western Weather
and Water Extremes

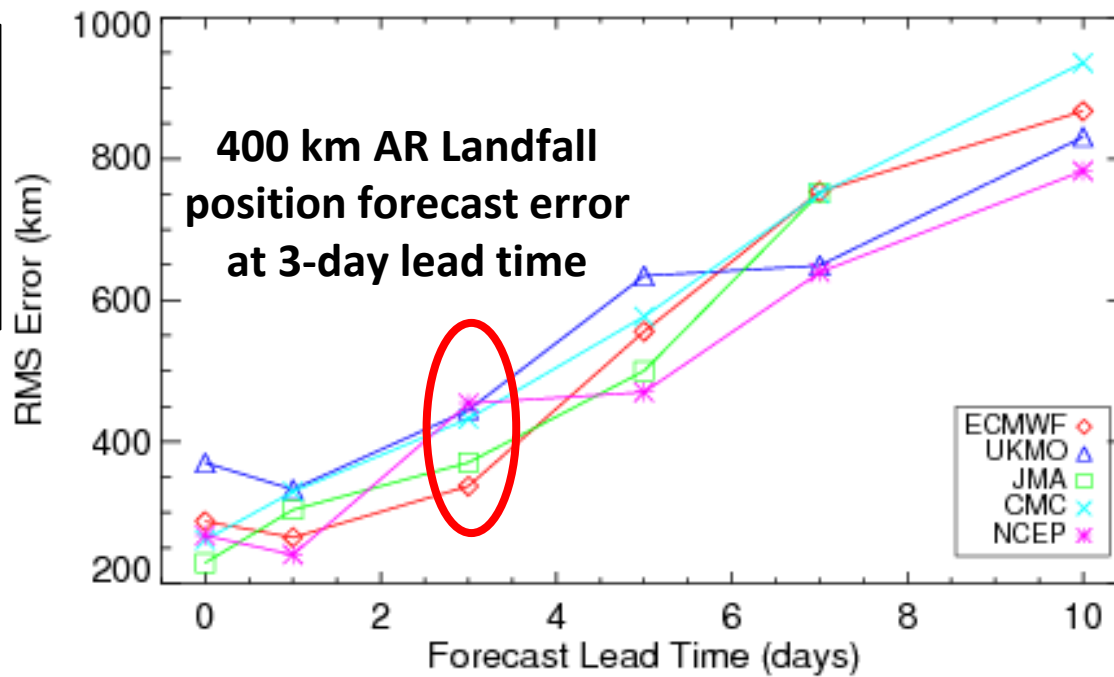
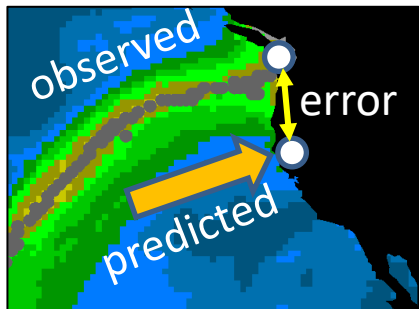
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Atmospheric River Reconnaissance

FM Ralph (Scripps/CW3E), V Tallapragada (NWS/NCEP), J Doyle (NRL)

Water managers, transportation sector, agriculture, etc...
require improved atmospheric river (AR) predictions

AR Forecast skill assessment establishes a performance baseline

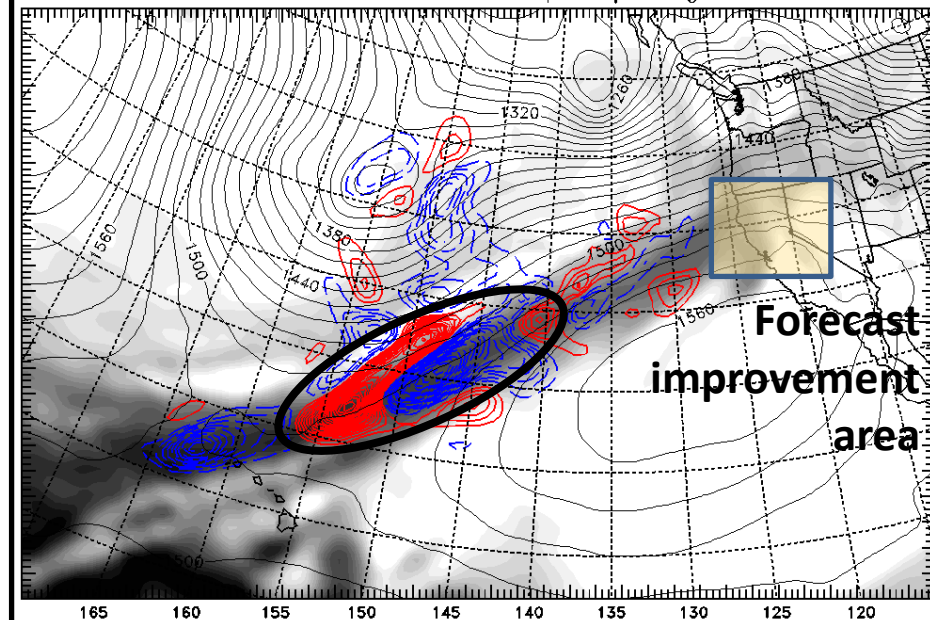


Wick, G.A., P.J. Neiman, F.M. Ralph, and T.M. Hamill, 2013: Evaluation of forecasts of the water vapor signature of atmospheric rivers in operational numerical weather prediction models. *Wea. Forecasting*, **28**, 1337-1352.

**New Adjoint includes moisture –
and finds AR is prime target**
36-h Sensitivity (Analysis) 00Z 13 February
(Final Time 12Z 14 February 2014)

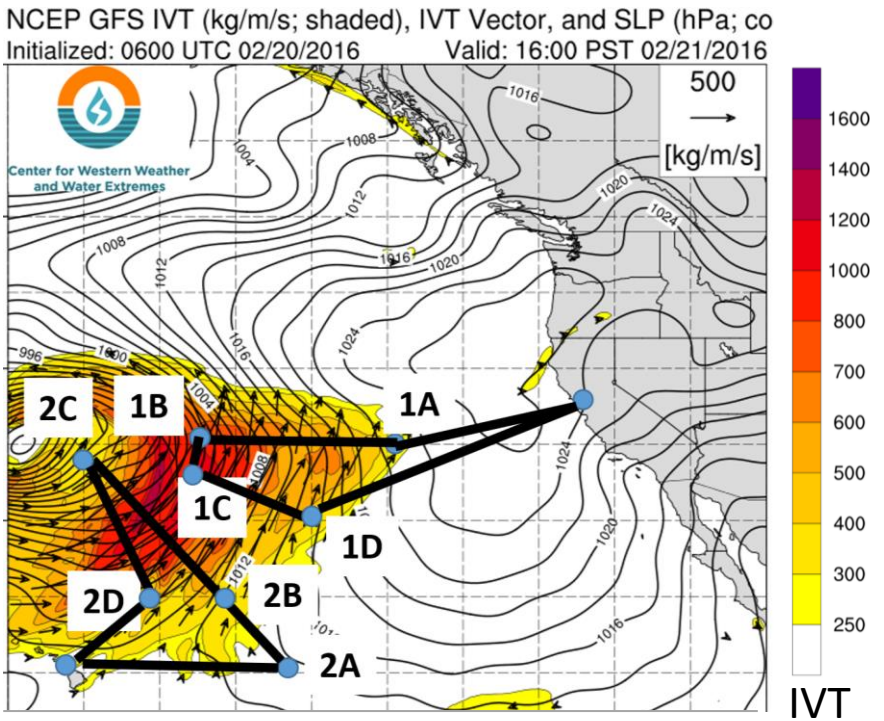
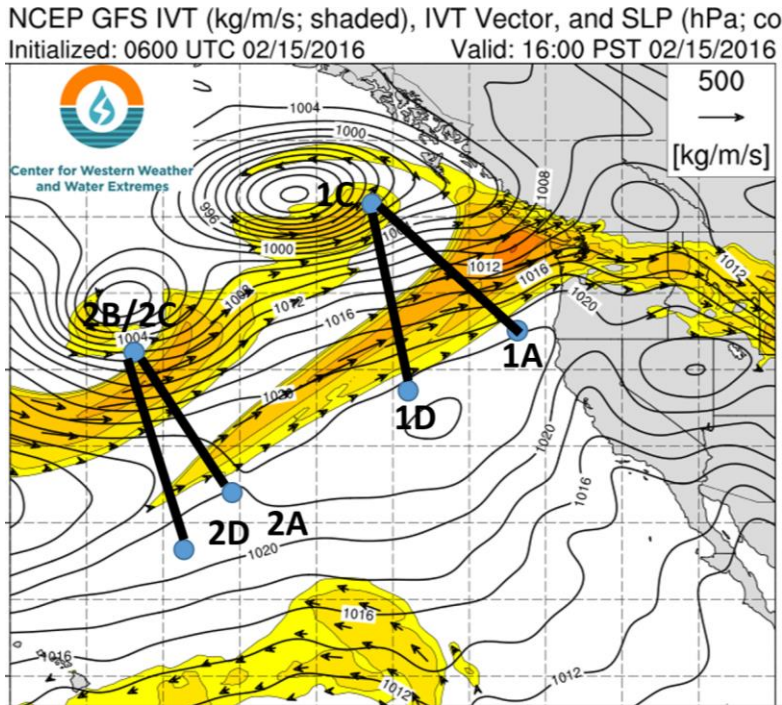
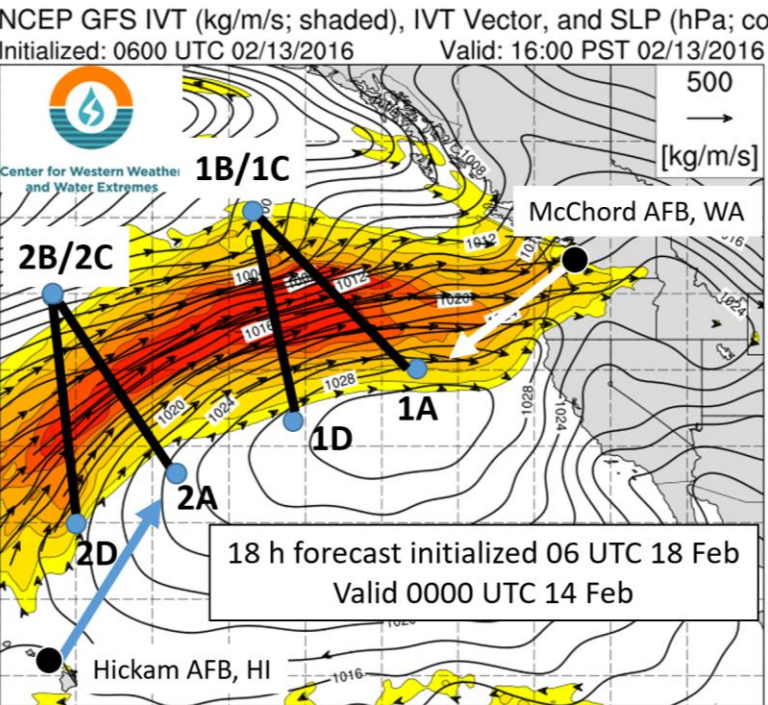
J. Doyle, C. Reynolds, C. Amerault, F.M. Ralph
(*International Atmospheric Rivers Conference 2016*)

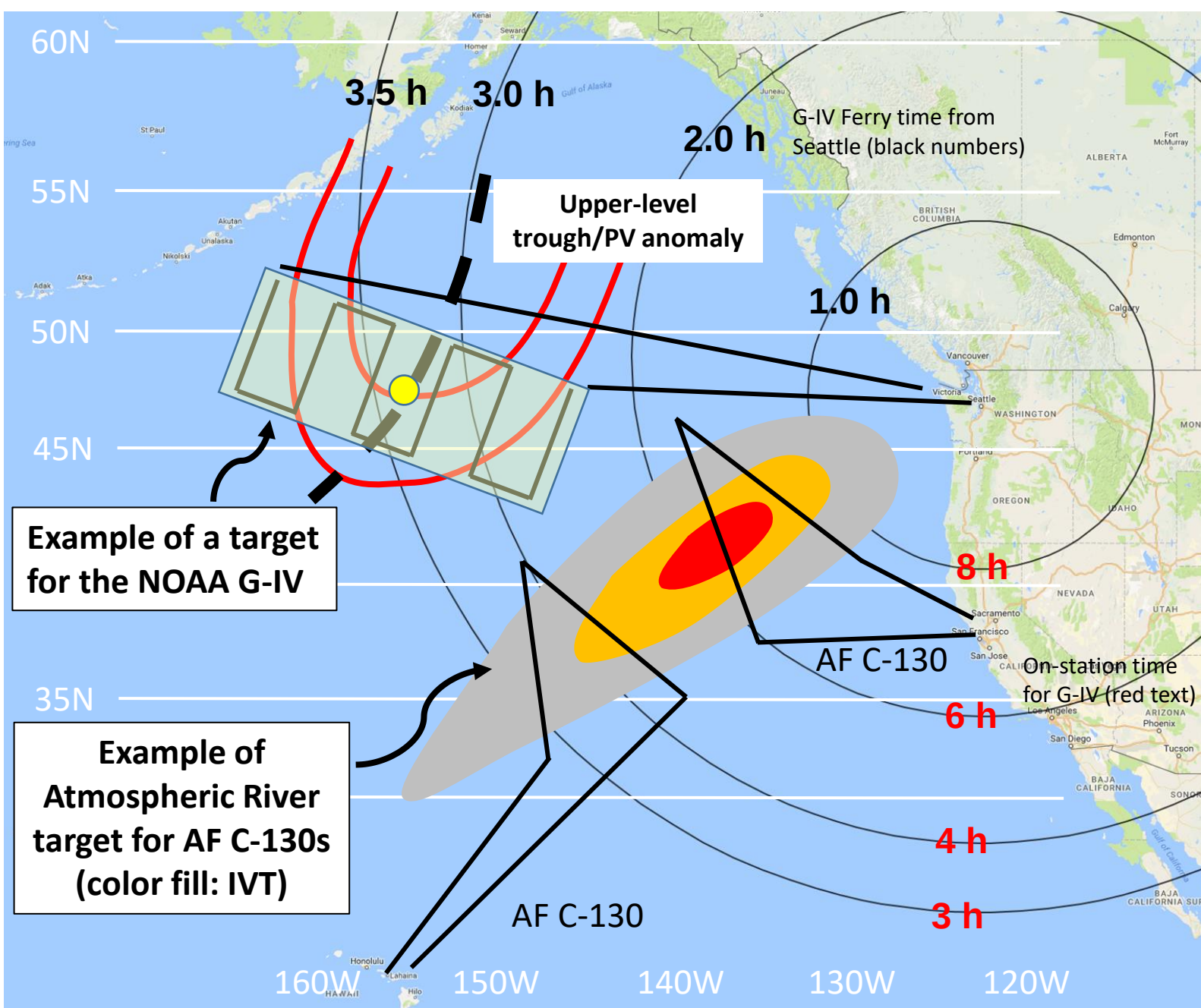
Color contours show the forecast sensitivity to 850 mb water vapor (grey shading) uncertainty at analysis time 00Z 13 Feb 2014 for a 36-h forecast over NorCal valid 12Z 14 Feb



- Moisture sensitivity is strongest along AR axis; located > 2000 km upstream
- **Moisture sensitivity substantially larger than temp. or wind sensitivity.**

2016 Atmospheric River Reconnaissance Flights





2018 Atmospheric River Reconnaissance Flight Strategies

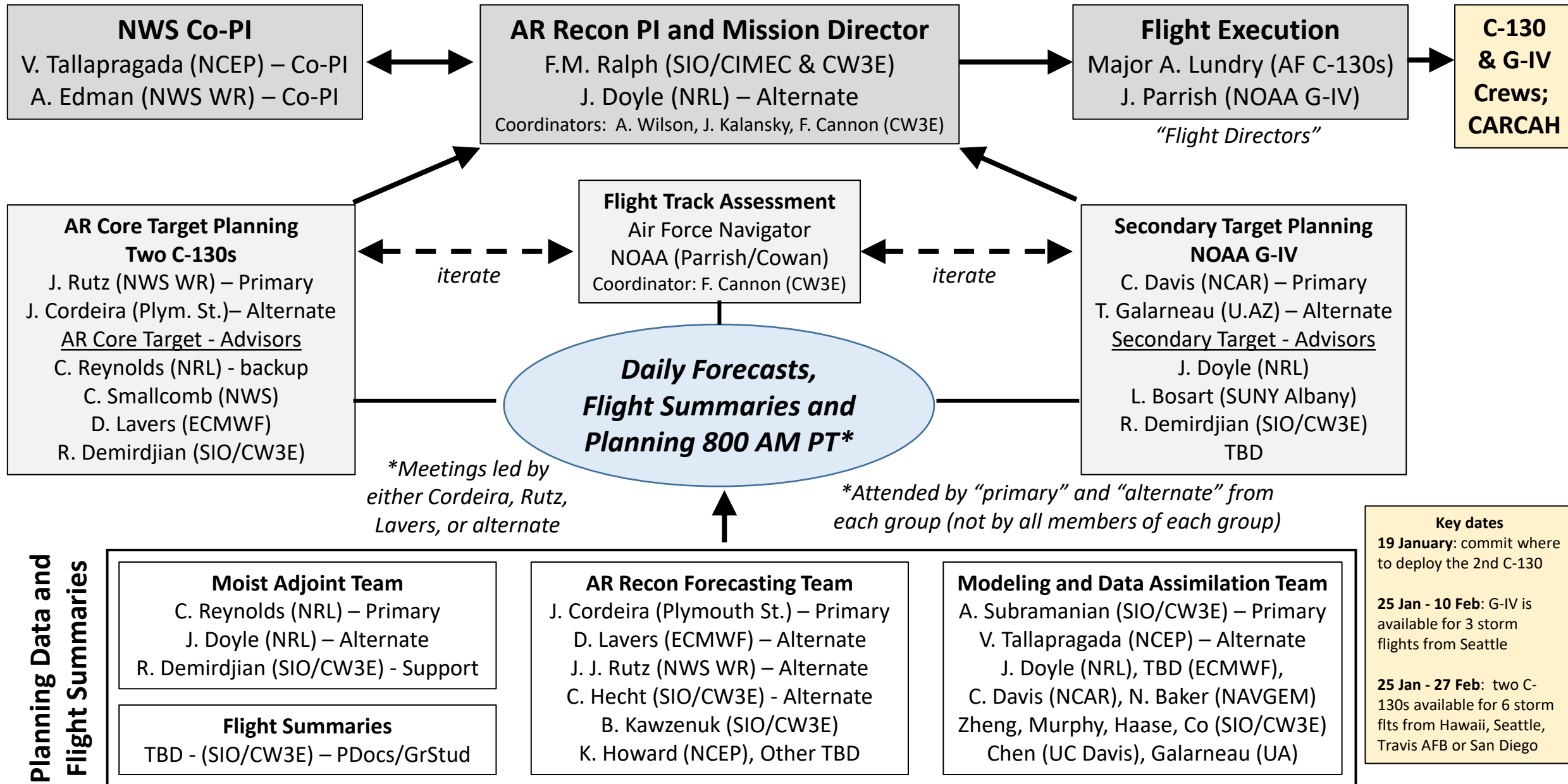
Center time: 0000 UTC
Dropsonde deployment window:
2100 – 0300 UTC



Each aircraft has a range of about 3500 nm

F.M. Ralph (AR Recon PI) and AR Recon Team

AR Recon – 2018 Flight Operations Planning and Execution



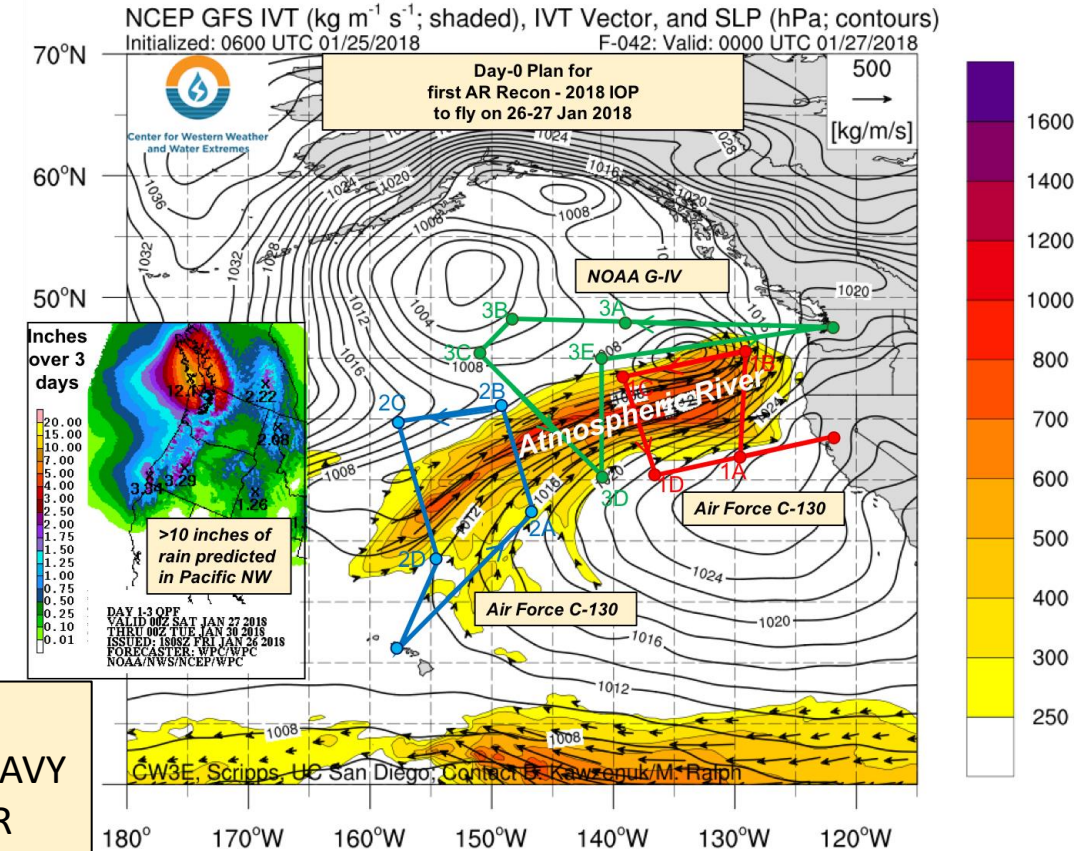
AR Recon – 2018: IOP 1 on 26-27 Jan 2018

Key sponsors include US Army Corps of Engineers, NOAA and California Dept. of Water Resources

Center time for dropsondes: 0000 UTC 27 Jan 2018

Number of dropsondes planned: 27, 26, 36 (C-130 H, C-130 C, G-IV)

- Mission Director: F. Martin Ralph (PI; Scripps/CW3E)
- Co-PIs: Vijay Tallapragada (NWS/NCEP), Andy Edman (NWS/Western Region)
- C-130 Flight Planning lead: Jon Rutz (NWS)
- G-IV Flight Planning Lead: Chris Davis (NCAR)
- Forecasting Lead: Jay Cordeira (Plymouth St. Univ.)
- Moist Adjoint Lead: Jim Doyle/Carolyn Reynolds (NRL)
- GPS sensor lead: Jennifer Haase (Scripps/IGPP and CW3E)
- AR Recon Coordinator: Anna Wilson (Scripps/CW3E)
- Flight Track Coordinator: Forest Cannon (Scripps/CW3E)
- Air Force C-130 Flight Director: Ashley Lundry (AF/53rd Weather Recon)
- NOAA G-IV Flight Director: Jack Parrish (NOAA/AOC)



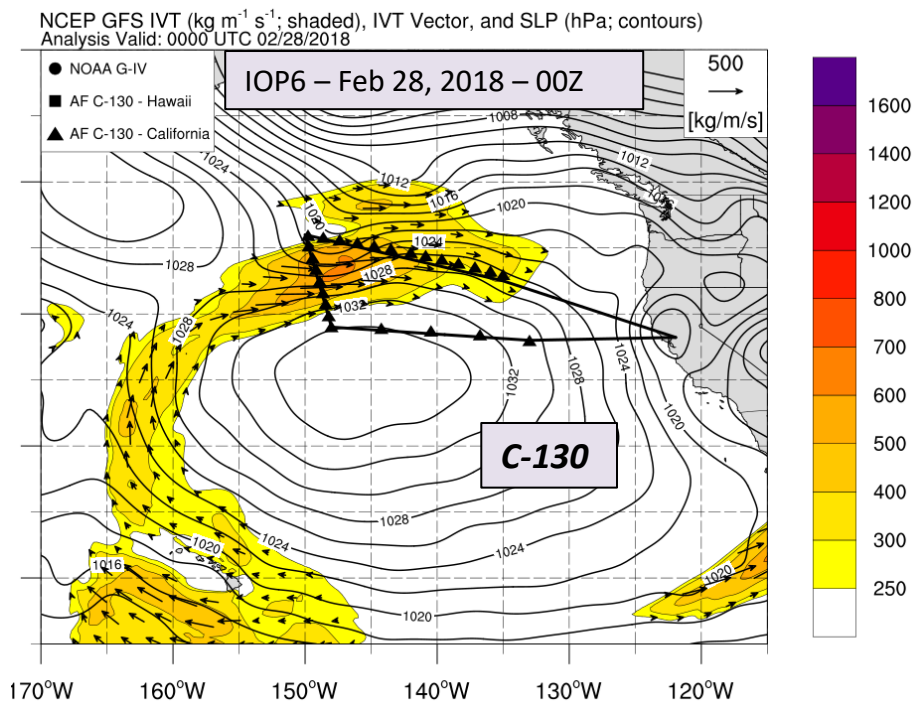
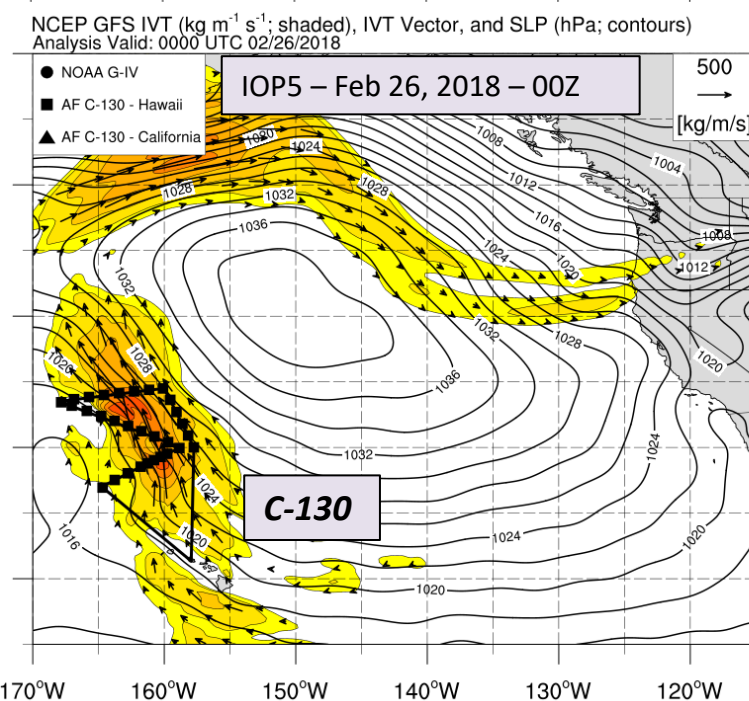
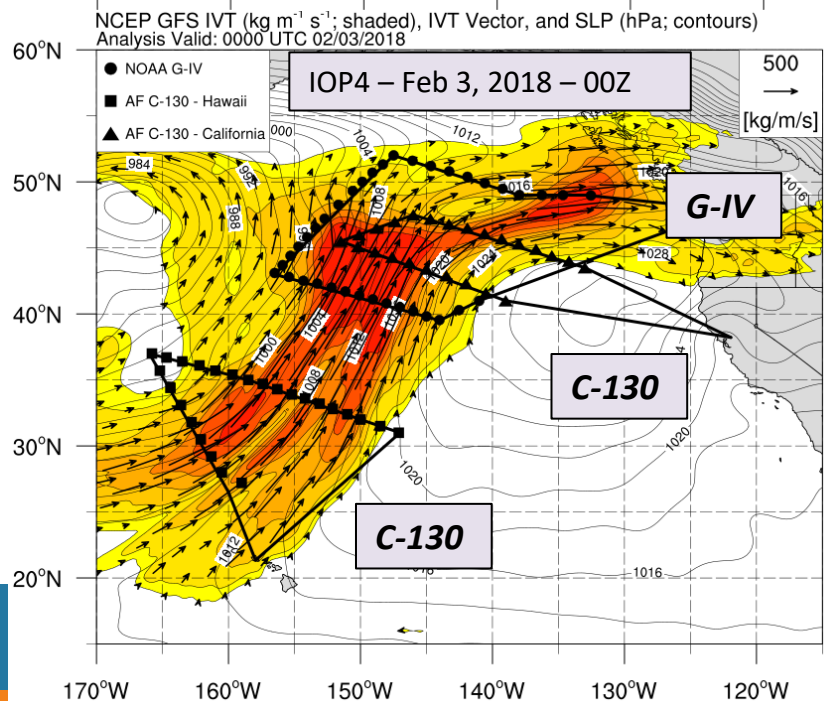
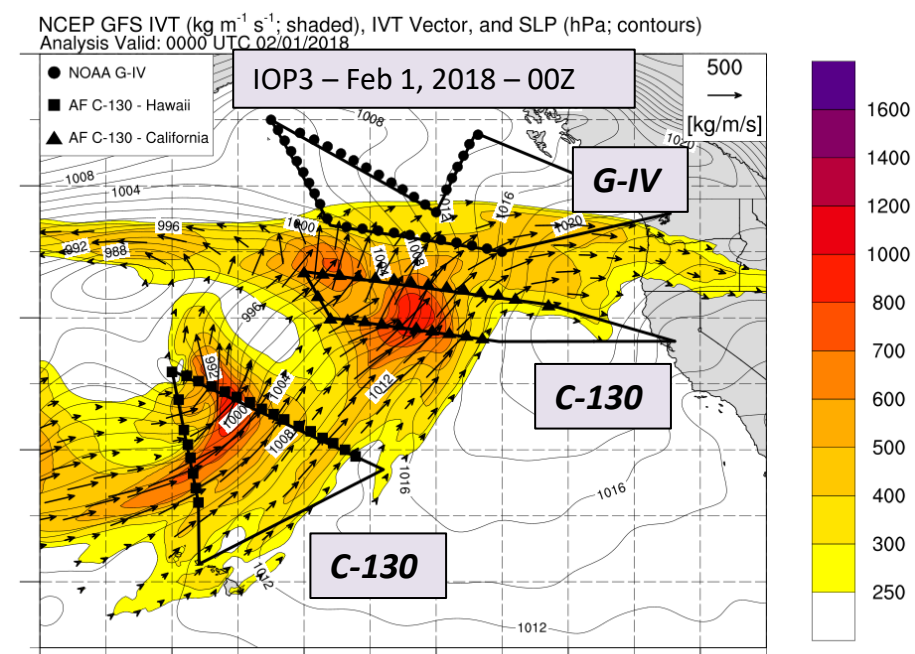
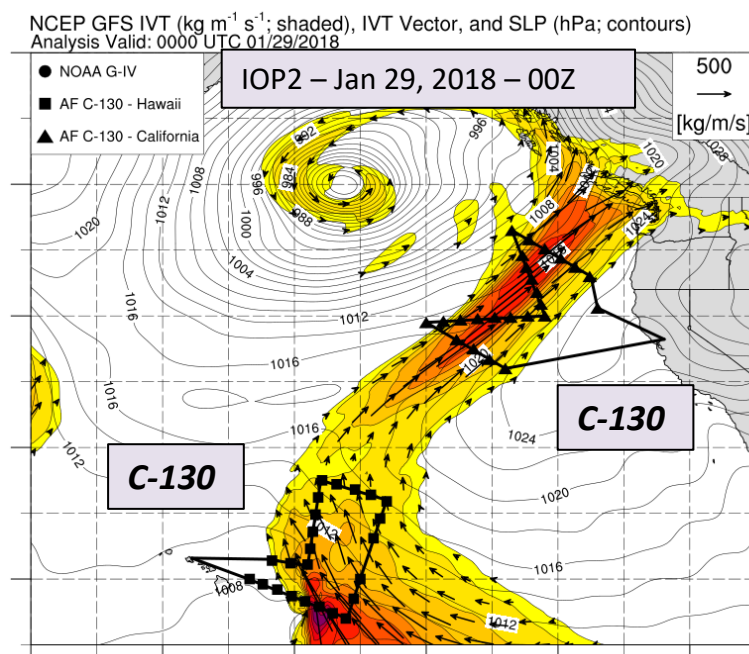
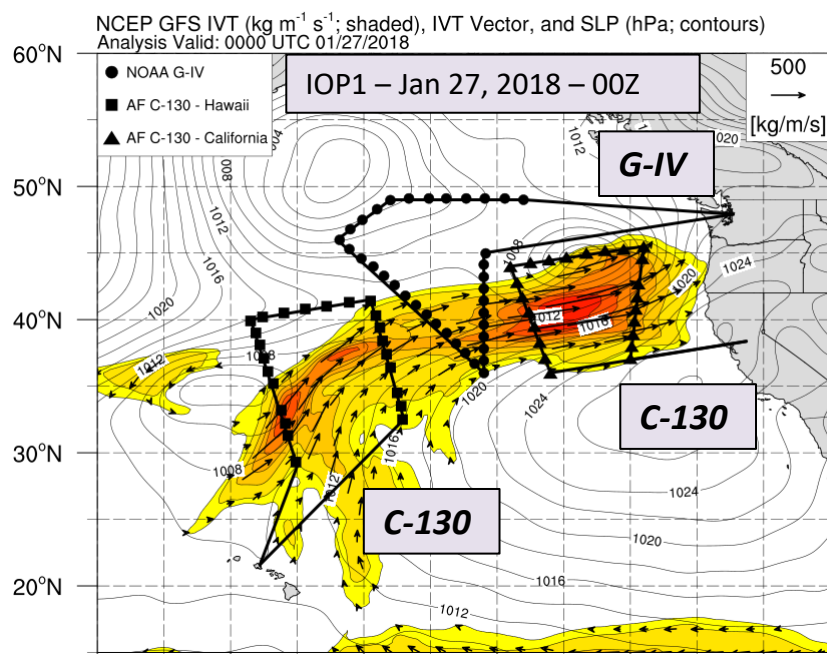
Modeling Partners

NWS/NCEP
ECMWF

US NAVY
NCAR



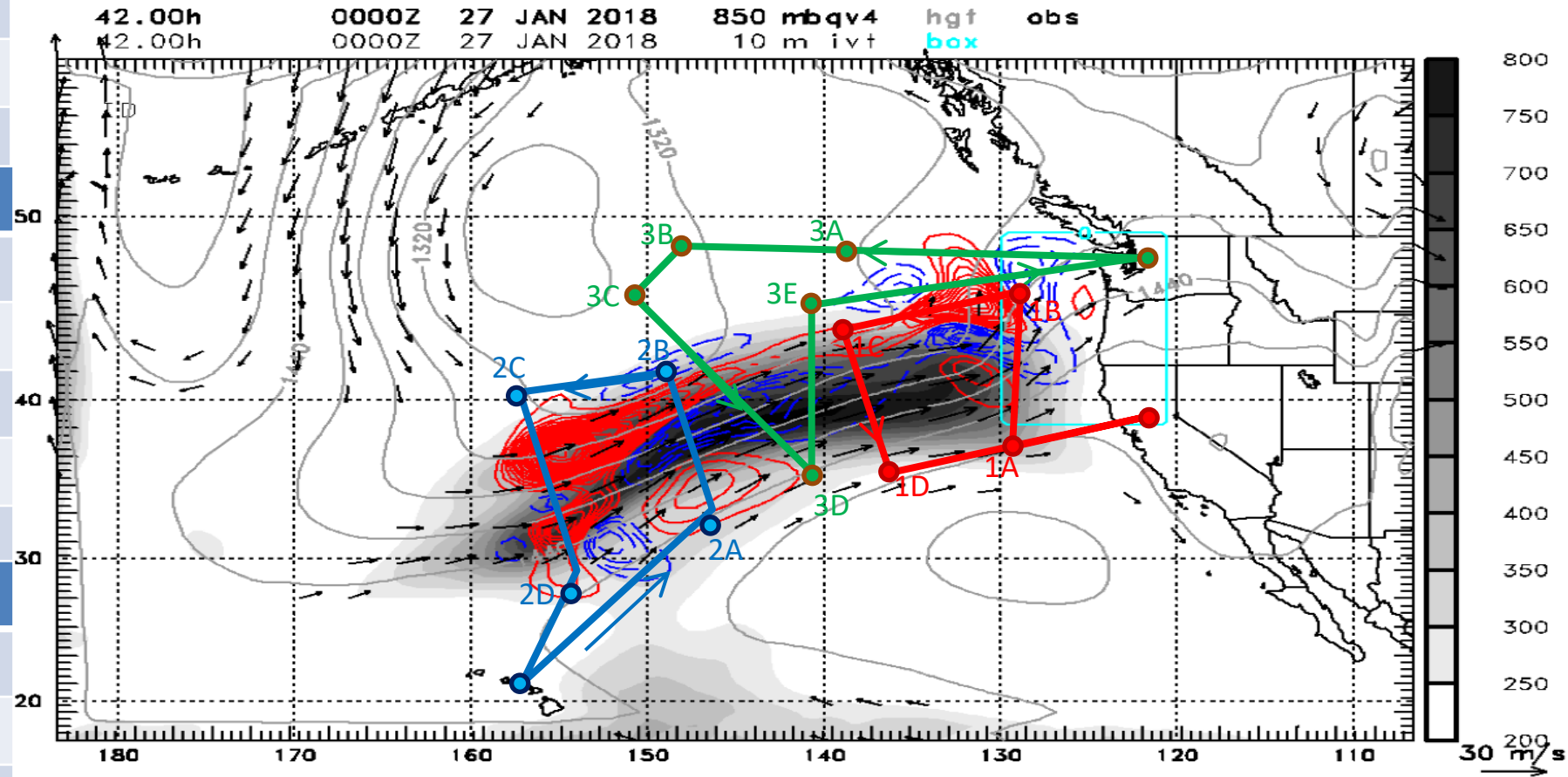
Forecaster	Chad Hecht (Scripps/CW3E)	Moist Adjoint support	Reuben Demirdjian (CW3E)
Forecaster	David Lavers (ECMWF)	Flight Planning (“alternate”)	Tom Galarneau (Univ. AZ)
Forecaster	Philippe Papin (NRL)	Onboard Scientist	Jon Rutz (NWS)
Forecaster	Aneesh Subramanian (Scripps/CW3E)	Onboard Scientist	Reuben Demirdjian (CW3E)
		Onboard Scientist (GPS)	Bing Cao (Scripps/IGPP)



C-130 CA	Lat	Lon
Travis AFB	38.37	-121.3
1A	37	-130
1B	45.5	-129
1C	44	-139
1D	36	-136
C-130 HI	Lat	Lon
HI. AFB	21.59	-157.8
2A	32.5	-147
2B	41.5	-149.5
2C	40	-158.5
2D	29	-155
G-IV	Lat	Lon
SEA	47.91	-122.28
3A	50	-128
3B	49	-148
3C	46	-152
3D	36	-141
3E	45	-141

provided by
J. Doyle and C. Reynolds

COAMPS Adjoint Sensitivity Valid at 00Z 27 January (42h)



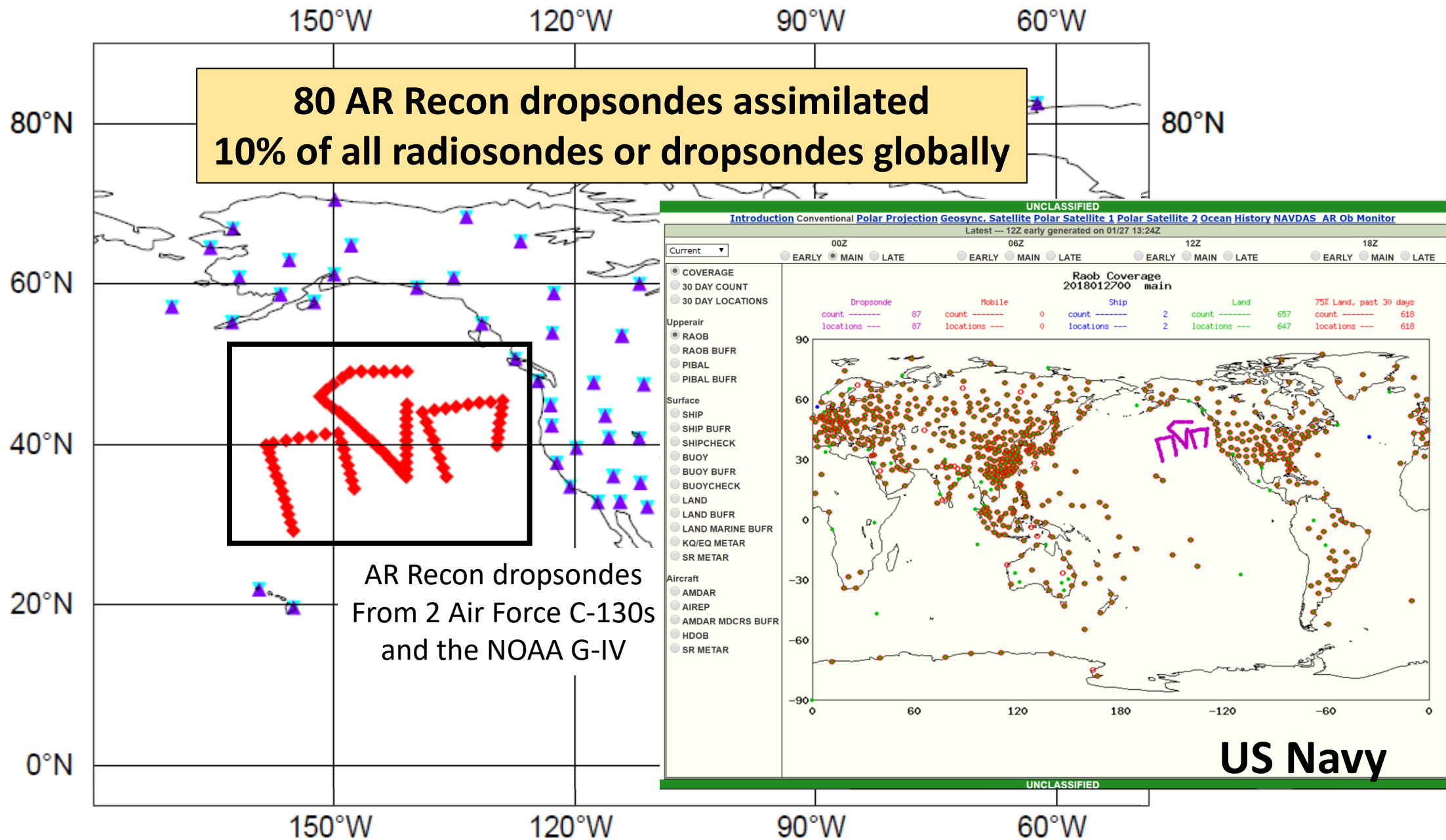
IVT (gray fill)

850 hPa Heights (gray contour) and Winds (vectors)

850 hPa Water Vapor Sensitivity (blue/red)

Response Function is 12-h Accumulated Precipitation (114 to 126h)

ECMWF Soundings Assimilated from AR Recon 2018 IOP 1 centered on 0000 UTC 27 Jan 2018



Atmospheric River Reconnaissance

Contacts:

F.M. Ralph (mralph@ucsd.edu)

V. Tallapragada (NCEP)

J. Doyle (NRL)

C. Davis (NCAR)

F. Pappenberger (ECMWF)

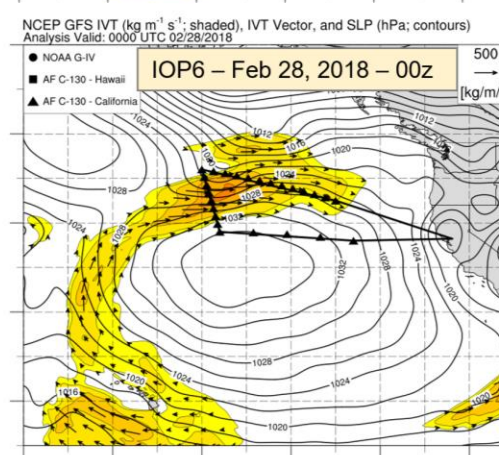
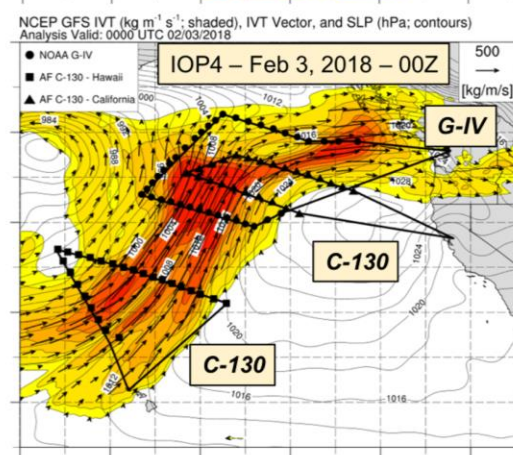
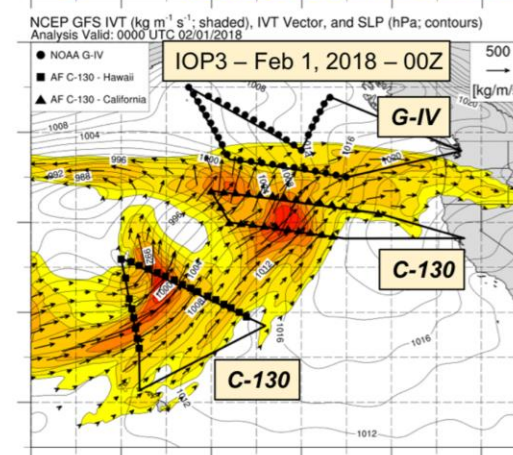
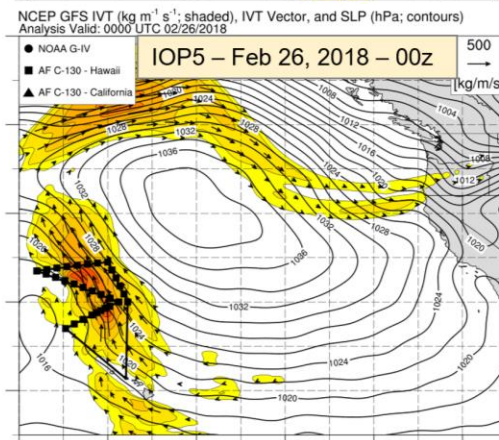
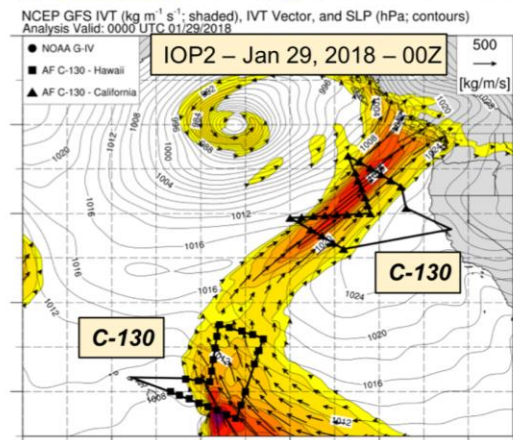
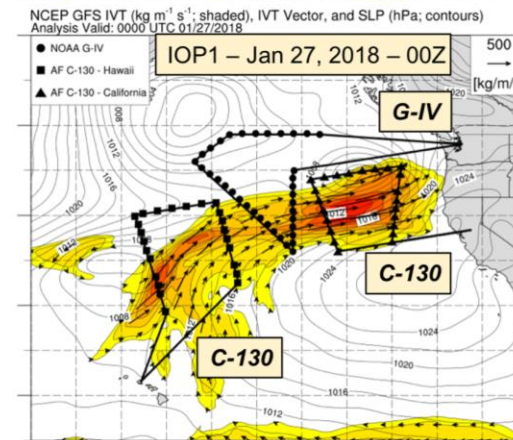
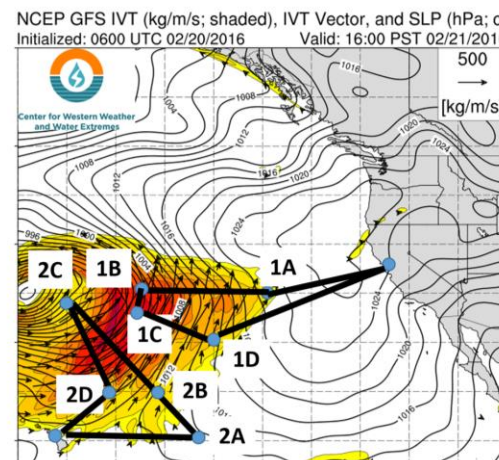
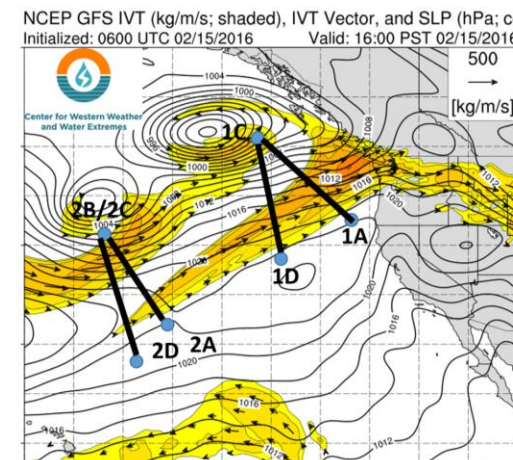
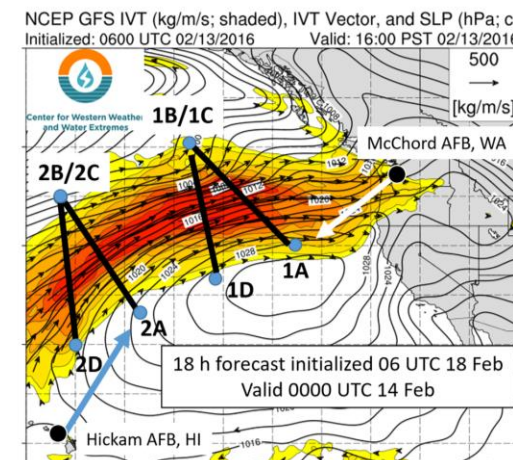
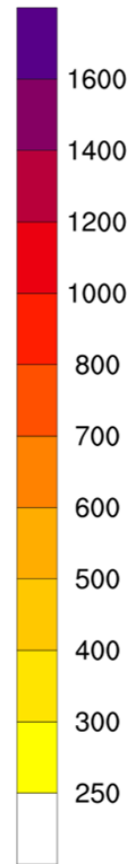
A. Subramanian (UCSD)

2016

2018

2018

Integrated Vapor Transport ($\text{kg s}^{-1} \text{m}^{-1}$)



AR Recon – 2019: Requesting 3 Aircraft to Sample 9 Storms

Two Air Force C-130s and NOAA's G-IV

- ✓ Feb 2016: 3 Storms (2 aircraft per storm)
- ✓ Jan-Feb 2018: 6 Storms (3 aircraft per storm in 3 storms; 2 aircraft in 1 storm; 1 aircraft in 2 storms)
- Jan-Mar 2019 (Requested): 9 storms (3 aircraft per storm)
- **Target total number of cases: 18 storms, with 1, 2 or 3 aircraft sampling each storm**
- ✓ Interagency, International Steering Committee in place
 - Carry out assessments
 - Refine data assimilation methods
 - Create appropriate evaluation metrics
 - Provide impact results in peer-reviewed publications

Contacts

F. M. Ralph (mralph@ucsd.edu)

V. Tallapragada (vijay.tallapragada@noaa.gov)



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Center for Western Weather
and Water Extremes



The mission of CW3E is to provide 21st Century water cycle science, technology and outreach to support effective policies and practices that address the impacts of extreme weather and water events on the environment, people and the economy of Western North America.

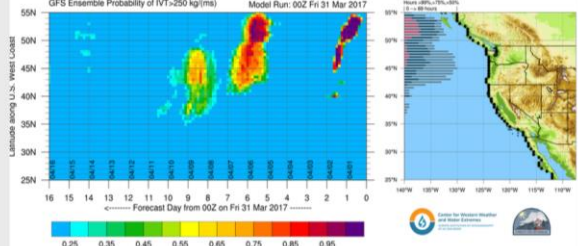
AR Observations

Precipitation Observations

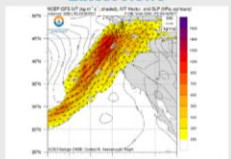
Model Forecasts

West-WRF Forecasts

Atmospheric River Forecasts

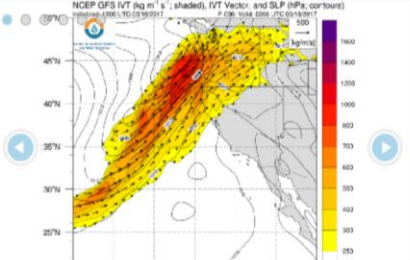


Latest News



CW3E AR Update: 16 March Outlook

CW3E News



Mar. 16: CW3E AR Update: 16 March 2017 Outlook

Mar. 9: Weather on Steroids: The Art of Climate Change Science

Mar. 8: CW3E Launches New Website

Mar. 8: Odds of Reaching 100% Water Year Precipitation – Mar Update

Mar. 7: Director of CW3E to Present at Birch Aquarium

Mar. 7: Current Winter Setting a New California-Wide Record Precipitation Accumulation

AR Forecast Tools

Extreme Event Summaries

Unique Observations

Are available at

CW3E.UCSD.EDU

Contact: mralth@ucsd.edu

S2S Outlooks Supporting Water

Goal: Develop week-2 and week-3 outlooks for AR activity on the US West Coast. Evaluate and improve understanding of outlooks on these timescales.

Scripps Institution of Oceanography: F.M. Ralph (PI), A. Subramanian

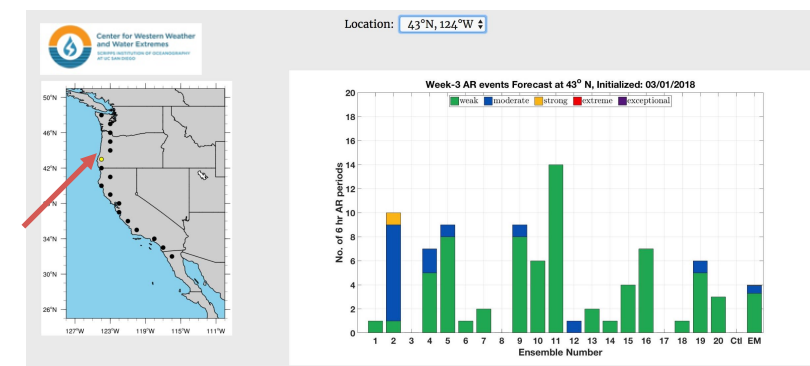
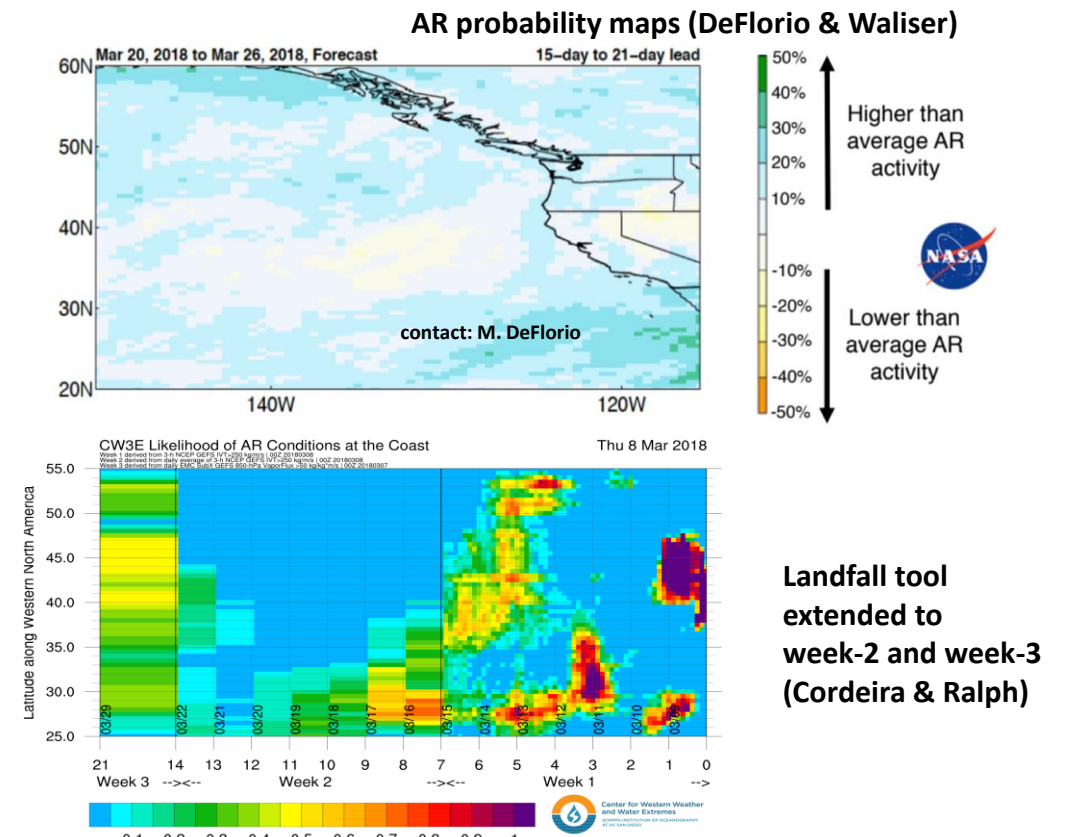
JPL : Duane Waliser, Mike DeFlorio, Bin Guan, Alex Goodman

PSU : Jay Cordeira

CSU : Elizabeth Barnes

Data : WCRP / WWRP S2S Project

**Supported by CA Dept. of Water Resources
Proposed working with NWS/NCEP/CPC**



AR scale probabilities for coastal locations (Subramanian & Ralph)

