



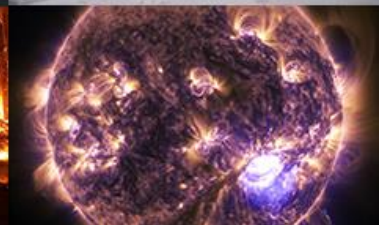
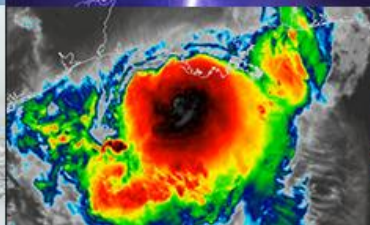
**NATIONAL  
WEATHER  
SERVICE**

# Impact of Dropsonde Data on NCEP operational GFS Forecasts from 2022-2023 Atmospheric River Reconnaissance

Xingren Wu<sup>1</sup>, Keqin Wu<sup>2</sup>, Vijay Tallapragada<sup>3</sup>, and Marty Ralph<sup>4</sup>

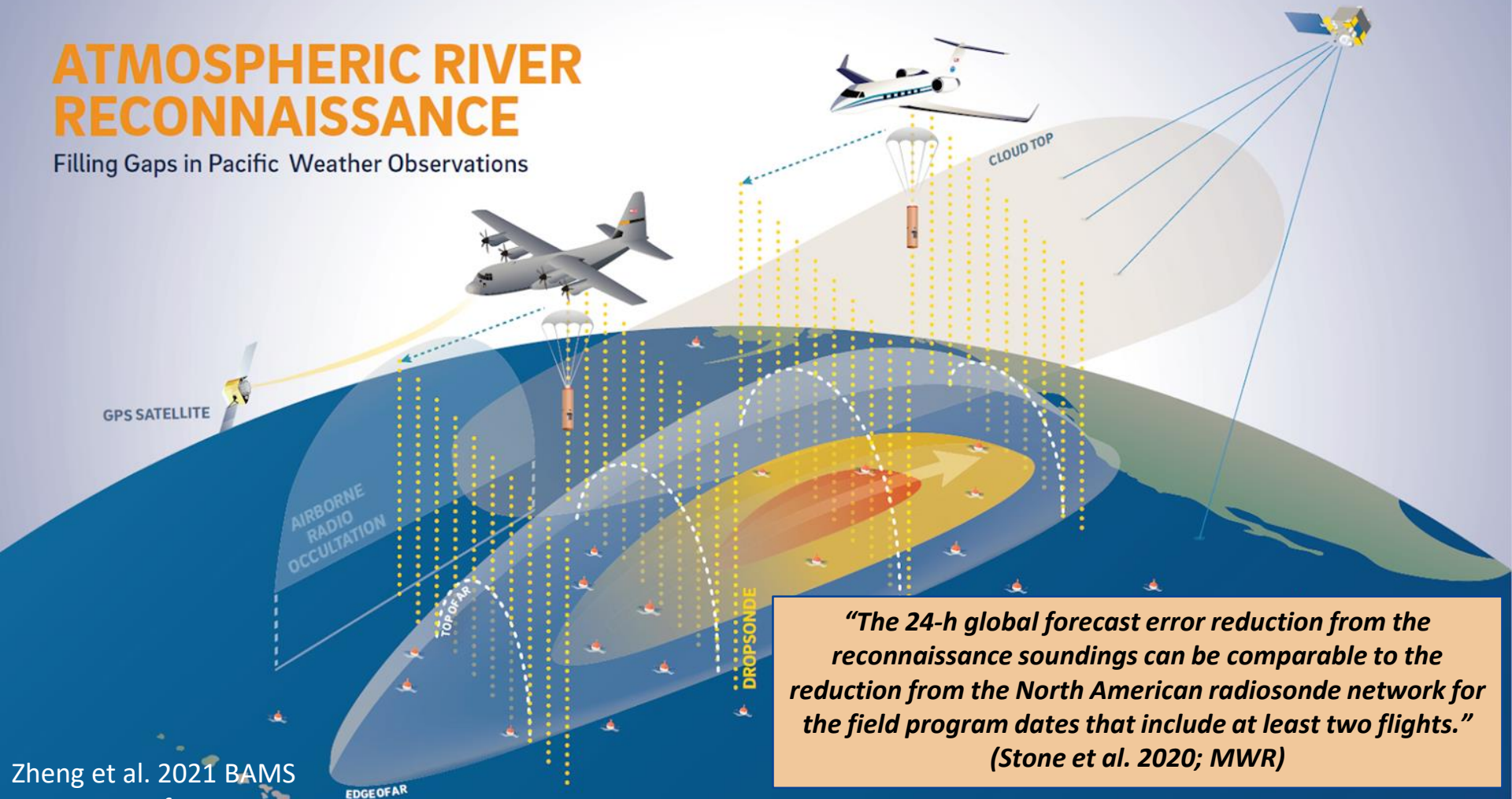
<sup>1</sup>*Axiom@NOAA/NWS/NCEP/EMC*, <sup>2</sup>*Lynker@NOAA/NWS/NCEP/EMC*,  
<sup>3</sup>*NOAA/NWS/NCEP/EMC*, <sup>4</sup>*CW3E*, Scripps Institution of Oceanography, UC San Diego

AR Recon Workshop 6/28/2023



# ATMOSPHERIC RIVER RECONNAISSANCE

Filling Gaps in Pacific Weather Observations



***“The 24-h global forecast error reduction from the reconnaissance soundings can be comparable to the reduction from the North American radiosonde network for the field program dates that include at least two flights.”***  
***(Stone et al. 2020; MWR)***

Zheng et al. 2021 BAMS  
BAMS cover figure in 2021

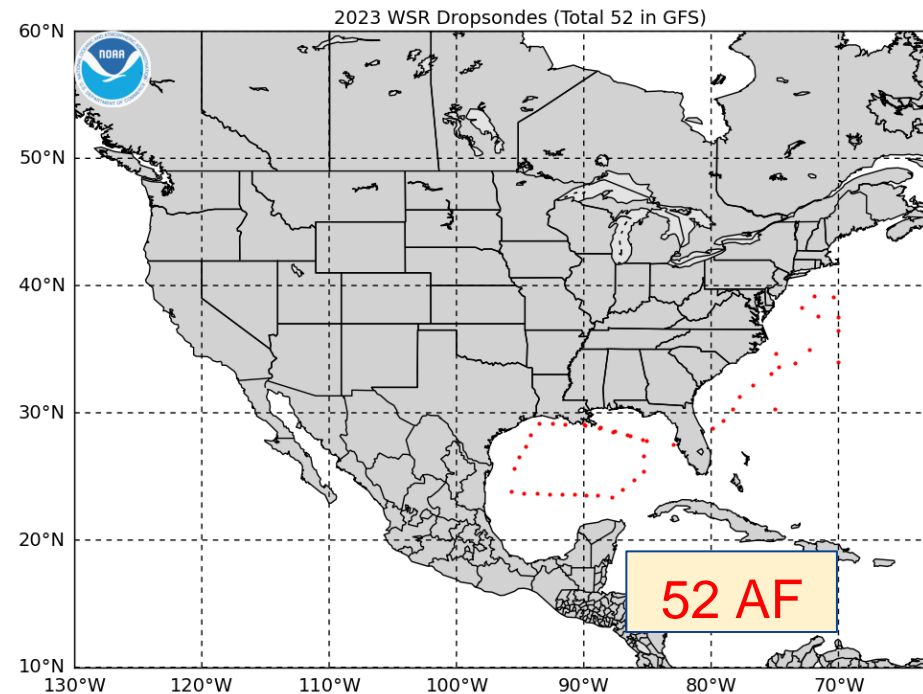
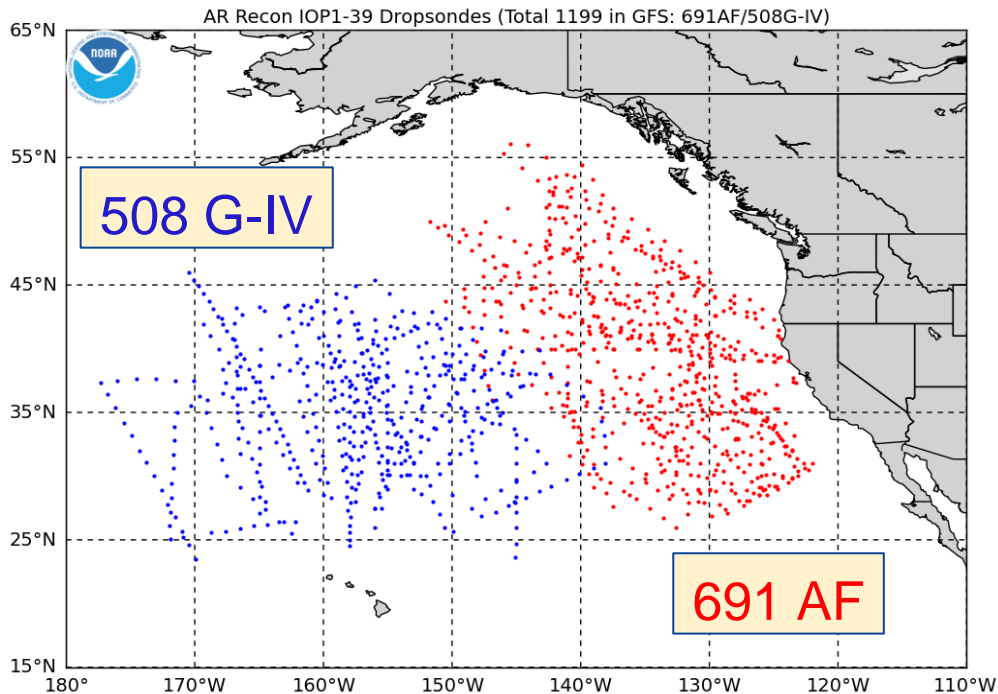


# AR Recon Campaign 2022-2023

39 AR IOPs (5 Nov 2022 – 14 Mar 2023)

First (longest) AR Sequence: 13 IOPs (6-18 Jan 2023)

3 WSR IOPs (3, 4, 14 Mar 2023)



# Operational goals for AR Recon at NCEP

- Overarching goal: improve operational predictions of land-falling atmospheric rivers and their impacts in the western U.S.
- Enhance the use of aircraft observations in modeling and data assimilation
- Design and develop ensemble based objective sampling strategies
- **Run (near) real time data denial experiments**
- Improve verification techniques



# Near Real-Time Data Deny Experiments with GFSv16.3.5

- ARR 2022-2023 season: Starting from Nov 5, 2022
- ARR near real-time data denial: Starting from Jan 6, 2023
  - CTRL – GFS operation, assimilate dropsonde and HDOBs data
  - DENY – the same setting as GFS operation, but deny dropsonde and HDOBs data

# GFSv16: Forecast Model & Data Assimilation

(Mar 22 2021)

## Model resolution:

127 vertical layers with model top of 80 km

## Physics updates:

**PBL/turbulence:** sa-TKE-EDMF (Revised background diffusivity as a stability dependent function)

**Radiation:** Updated calculation of solar radiation absorption by water clouds; Updated cloud overlap assumptions.

**Microphysics:** Updated GFDL microphysics scheme for computing ice cloud effective radius

## GDAS

- **Local Ensemble Kalman Filter (LETKF):** with model space localization and linearized observation operator to replace the Ensemble Square Root Filter (EnSRF)
- **4-Dimensional Incremental Analysis Update (4D-IAU)**
- **New variational QC**
- Assimilate **AMSU-A** channel 14 and **ATMS** channel 15 w/o bias correction
- **HDOBs:** Assimilate high-density flight-level wind, temperature, and moisture observations (HDOBs) in tropical storm environment (first time in operations for GFS)

# GFSv16.3.5: Forecast Model & Data Assimilation

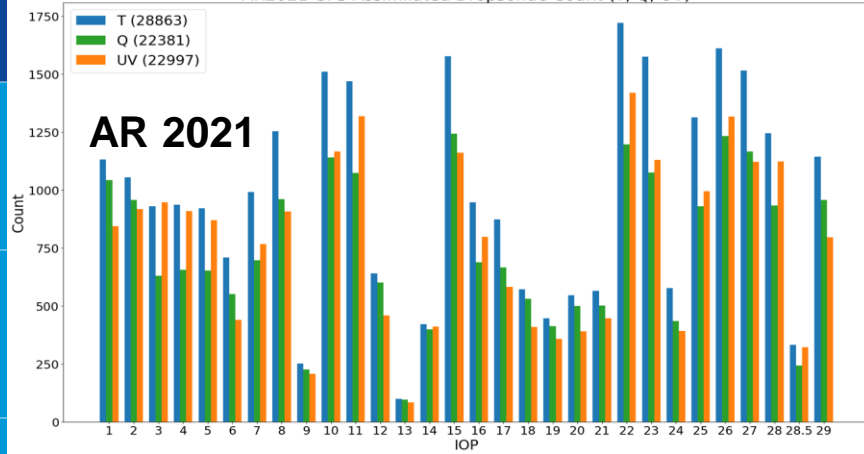
## (Most recent update: Jan 4, 2023)

- GFS Post Processing system upgrades
- **FV3 model physics upgrade** in the Noah Land Surface Model
- **Grid-point Statistics Interpolation (GSI) Analysis** - Enhance the use of observations, add new data, improve the near sea surface temperature (NSST) analysis, and bug fixes.
- **Data assimilation upgrade related to GOES-18 and VIIRS**
  - Continued use of atmospheric motion vectors from the GOES-West satellite as GOES-18 replaces GOES-17 and to include the assimilation of VIIRS (Visible Infrared Imaging Radiometer Suite) radiances from S-NPP (Suomi National Polar-orbiting Partnership) and NOAA-20

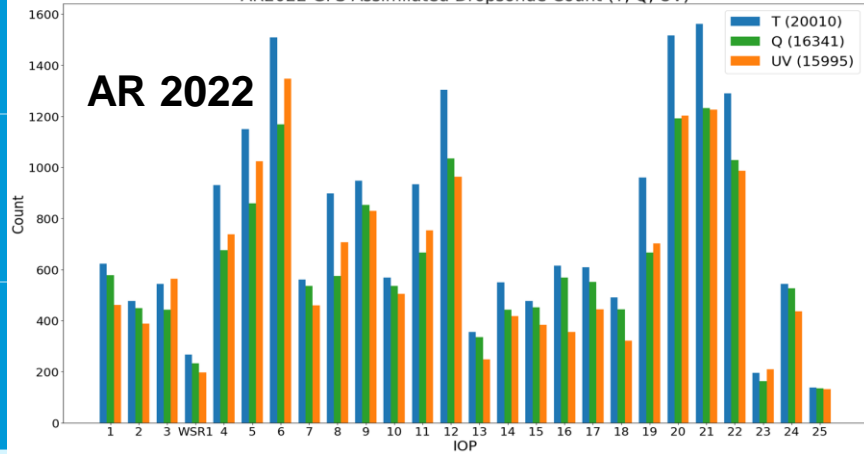


# AR Recon Dropsonde Obs Counts

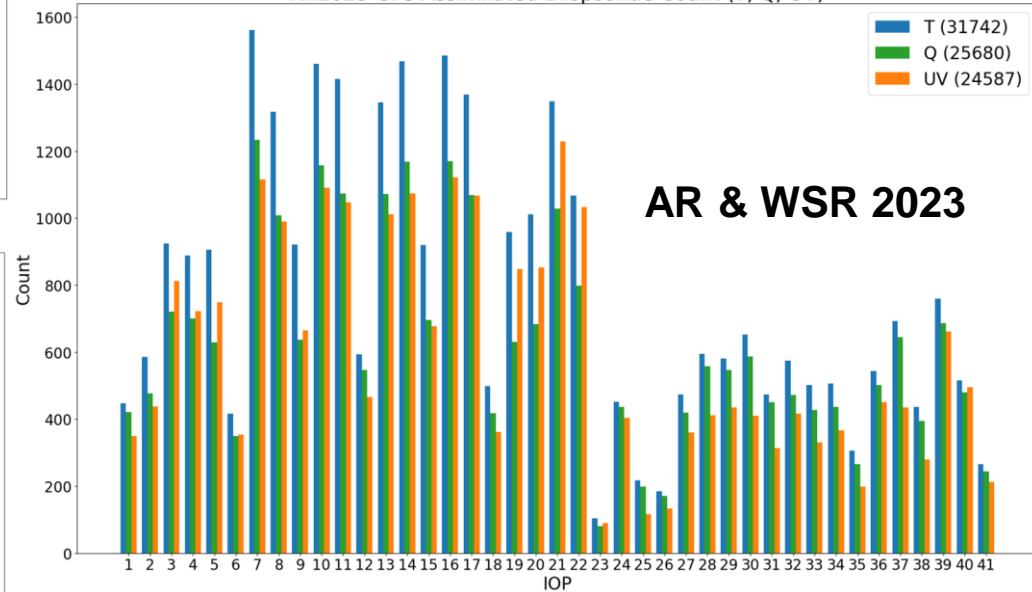
AR2021 GFS Assimilated Dropsonde Count (T, Q, UV)



AR2022 GFS Assimilated Dropsonde Count (T, Q, UV)



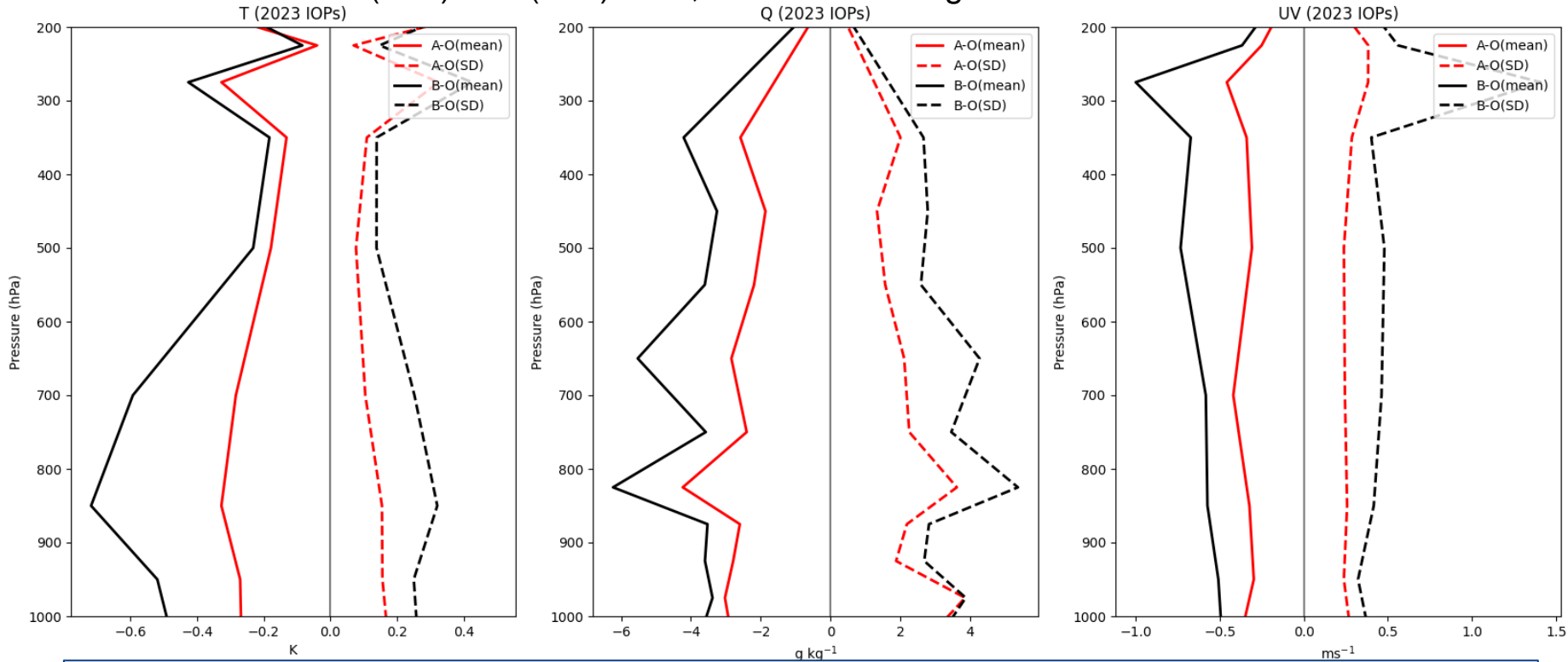
AR2023 GFS Assimilated Dropsonde Count (T, Q, UV)





# GFS DA with Dropsondes data

Mean of (A-O) and (B-O) for T, Q and UV during Jan 6 and Mar 14 from GFS



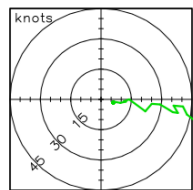
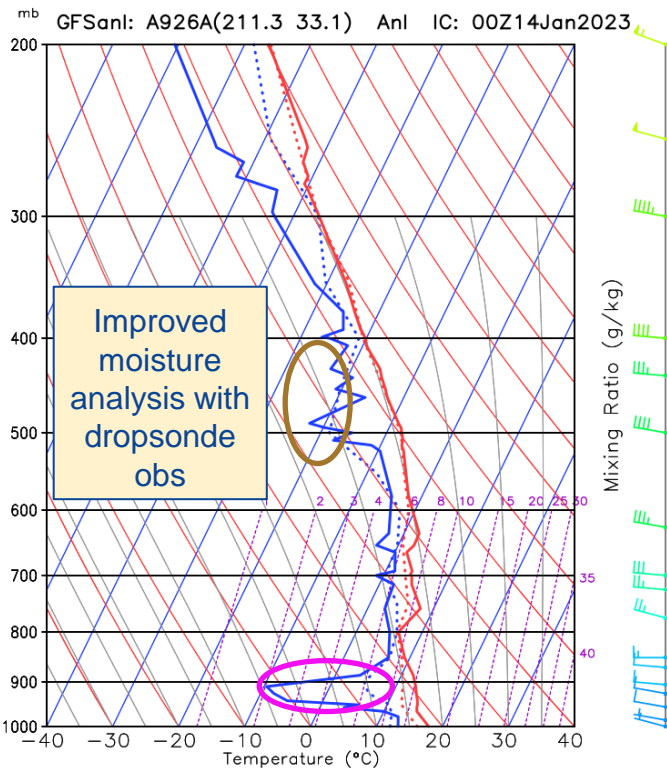
Improved analysis in T/Q/UV with dropsonde obs





# Ctrl: GFS Anl with dropsonde 00Z 14 Jan (211.3E 33.1N)

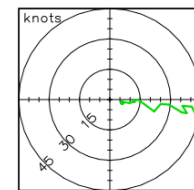
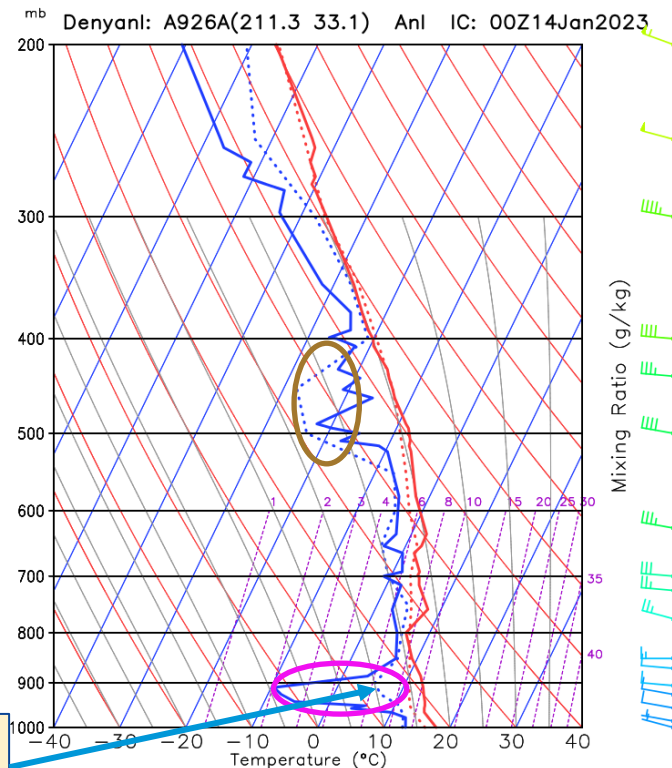
# Deny: GFS Anl without dropsonde 00Z 14 Jan (211.3E 33.1N)



K	18
TT	31
PW (cm)	2.91
Lowest level	
Press (mb)	1000
Temp (°C)	17.9
Dewp (°C)	13.2
$\theta_t$ (K)	318.1
LI (°C)	10
CAPE (Jkg <sup>-1</sup> )	10
CIN (Jkg <sup>-1</sup> )	0
Most Unstable	
Press (mb)	757
Temp (°C)	17.9
Dewp (°C)	13.2
$\theta_t$ (K)	322.9
LI (°C)	7
CAPE (Jkg <sup>-1</sup> )	0
CIN (Jkg <sup>-1</sup> )	0

Obs: Solid lines  
GFS: Dotted lines

Model forecast issue

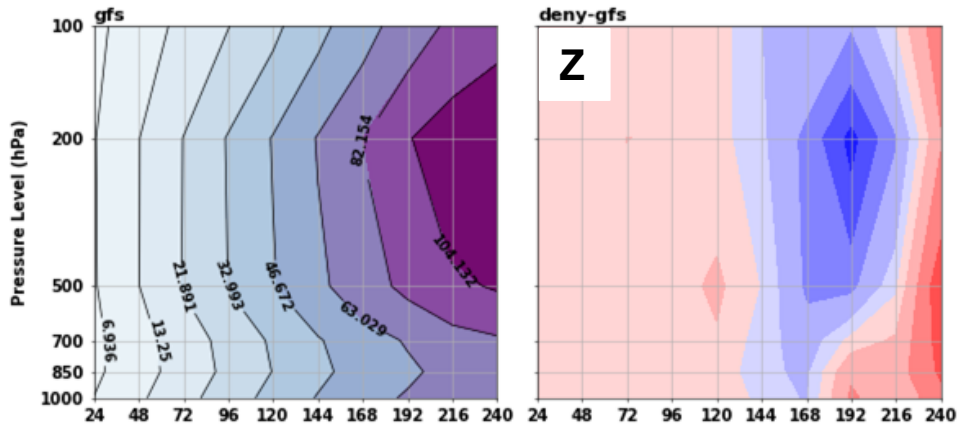


K	18
TT	31
PW (cm)	2.91
Lowest level	
Press (mb)	1000
Temp (°C)	17.9
Dewp (°C)	13.2
$\theta_t$ (K)	318.1
LI (°C)	10
CAPE (Jkg <sup>-1</sup> )	10
CIN (Jkg <sup>-1</sup> )	0
Most Unstable	
Press (mb)	757
Temp (°C)	17.9
Dewp (°C)	13.2
$\theta_t$ (K)	322.9
LI (°C)	7
CAPE (Jkg <sup>-1</sup> )	0
CIN (Jkg <sup>-1</sup> )	0

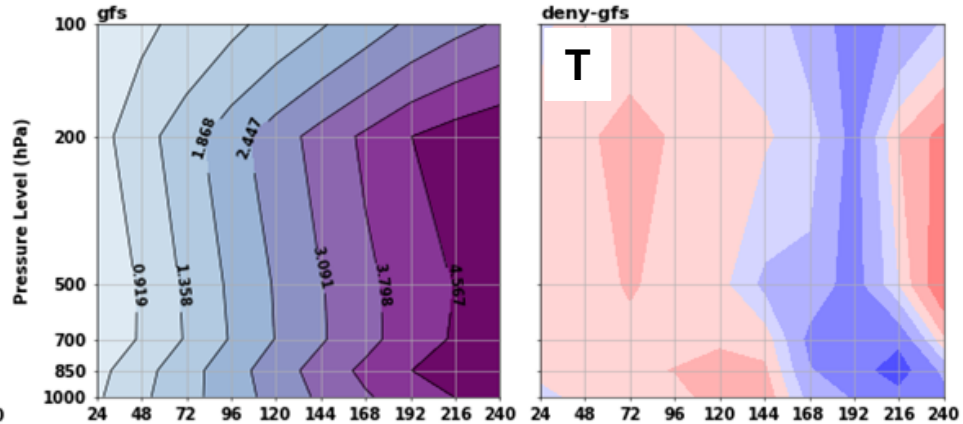
Obs: Solid lines  
Deny: Dotted lines



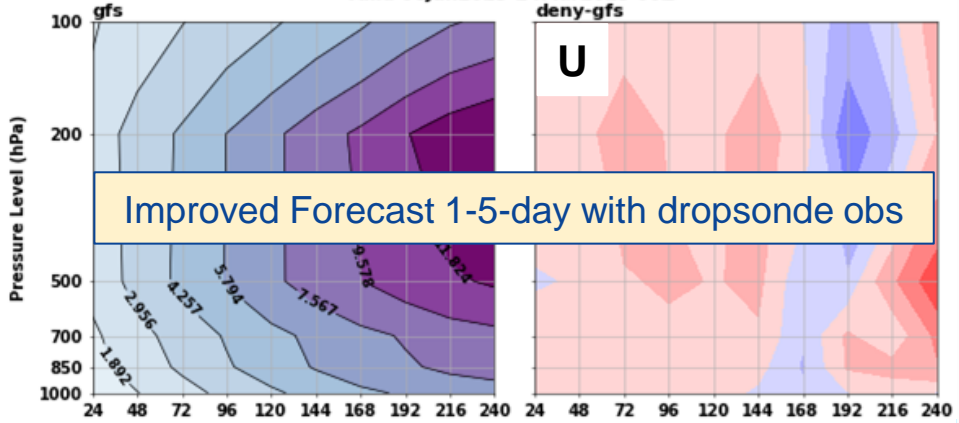
**Root Mean Square Error  
Geopotential Height (gpm), Pacific North America  
valid 06Jan2023-24Mar2023 00Z**



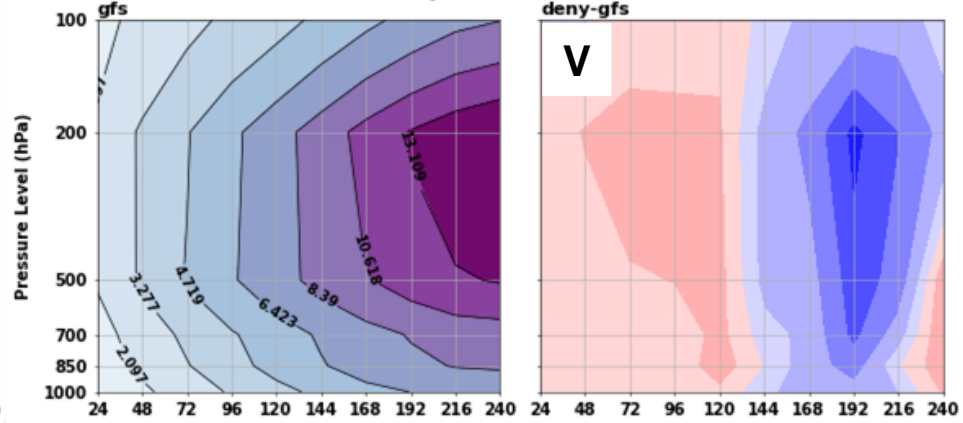
**Root Mean Square Error  
Temperature (K), Pacific North America  
valid 06Jan2023-24Mar2023 00Z**



**Root Mean Square Error  
Zonal Wind ( $m s^{-1}$ ), Pacific North America  
valid 06Jan2023-24Mar2023 00Z**



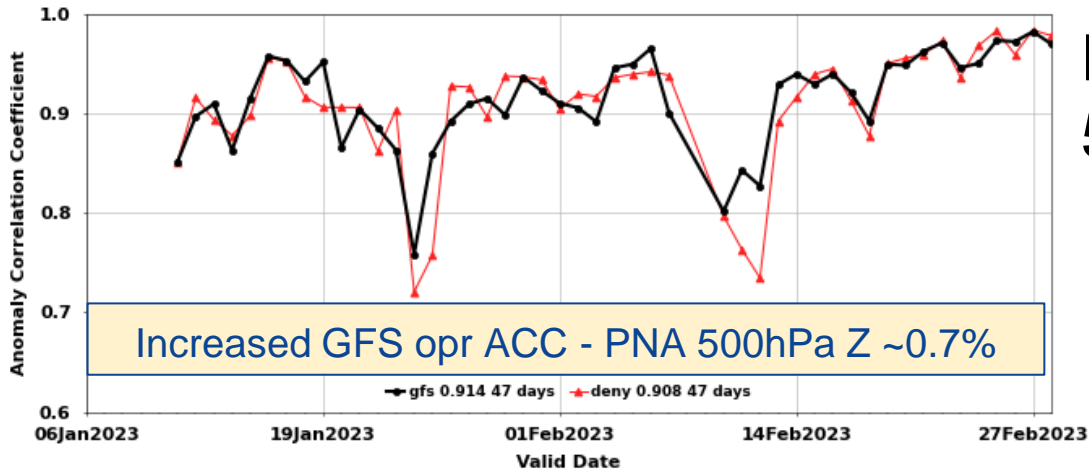
**Root Mean Square Error  
Meridional Wind ( $m s^{-1}$ ), Pacific North America  
valid 06Jan2023-24Mar2023 00Z**



Improved Forecast 1-5-day with dropsonde obs

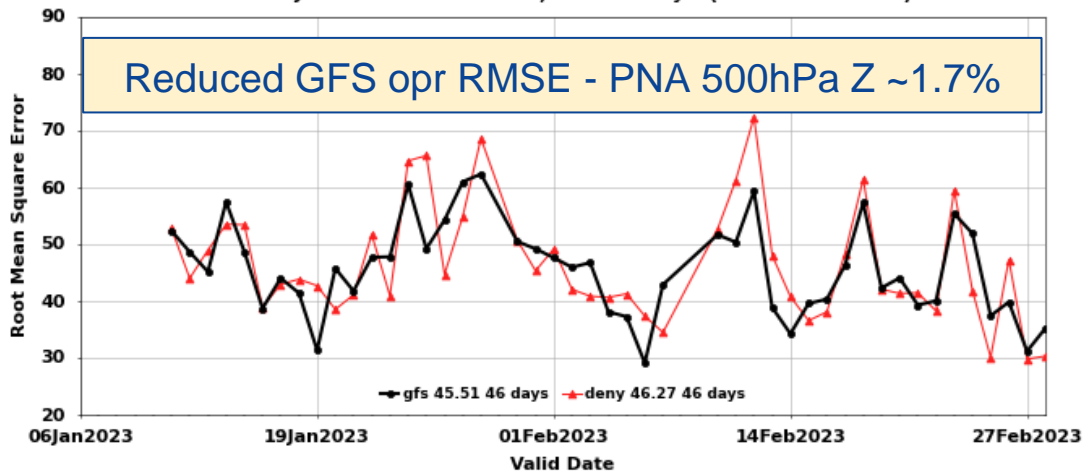


Anomaly Correlation Coefficient  
500 hPa Geopotential Height (gpm), Pacific North America  
valid 06Jan2023-28Feb2023 00Z, Forecast Day 5 (Forecast Hour 120)



**PNA 120-h ACC**  
500 hPa Z (0.914/0.908)

Root Mean Square Error  
500 hPa Geopotential Height (gpm), Pacific North America  
valid 06Jan2023-28Feb2023 00Z, Forecast Day 5 (Forecast Hour 120)



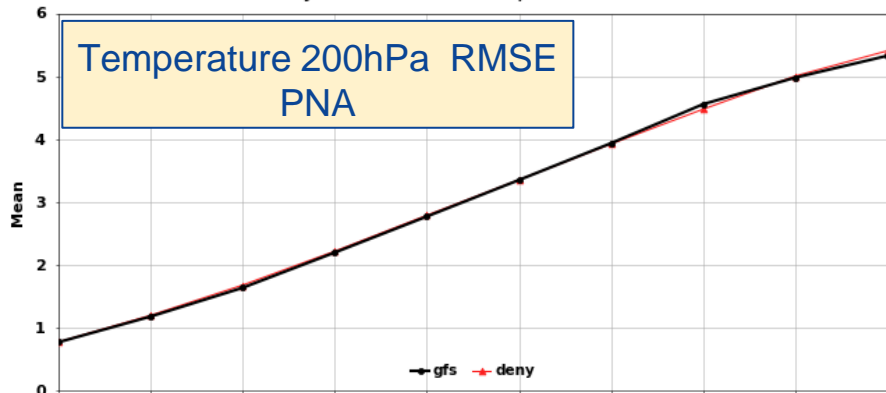
**PNA 120-h RMSE**  
500 hPa Z (45.51/46.27)





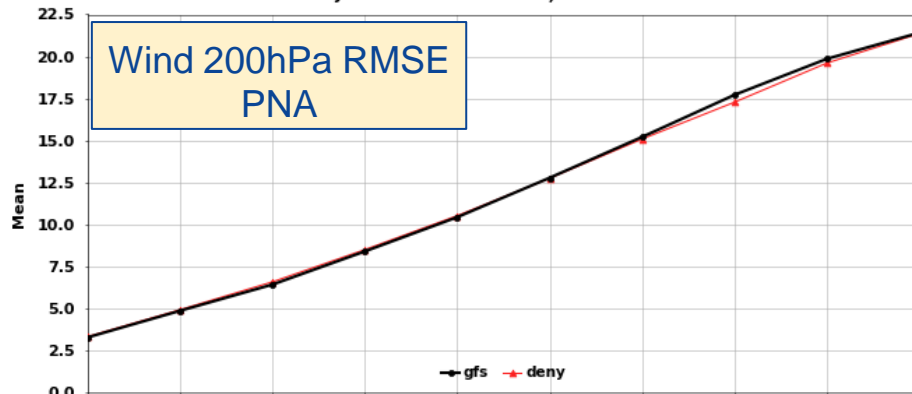
# PNA RMSE Temp

Root Mean Square Error  
200 hPa Temperature (K), Pacific North America  
valid 06Jan2023-24Mar2023 00Z, forecast hour means



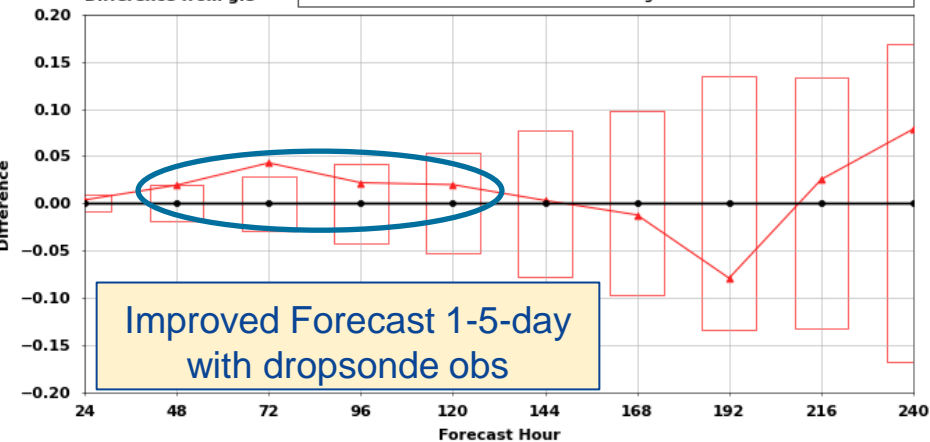
# PNA RMSE Wind

Root Mean Square Error  
200 hPa Vector Wind ( $m s^{-1}$ ), Pacific North America  
valid 06Jan2023-24Mar2023 00Z, forecast hour means



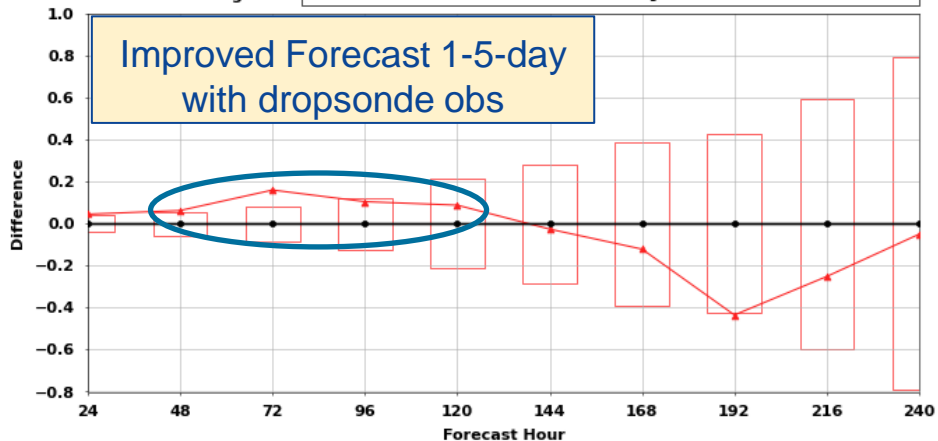
Difference from gfs

Note: differences outside the outline bars are significant at the 95% confidence level

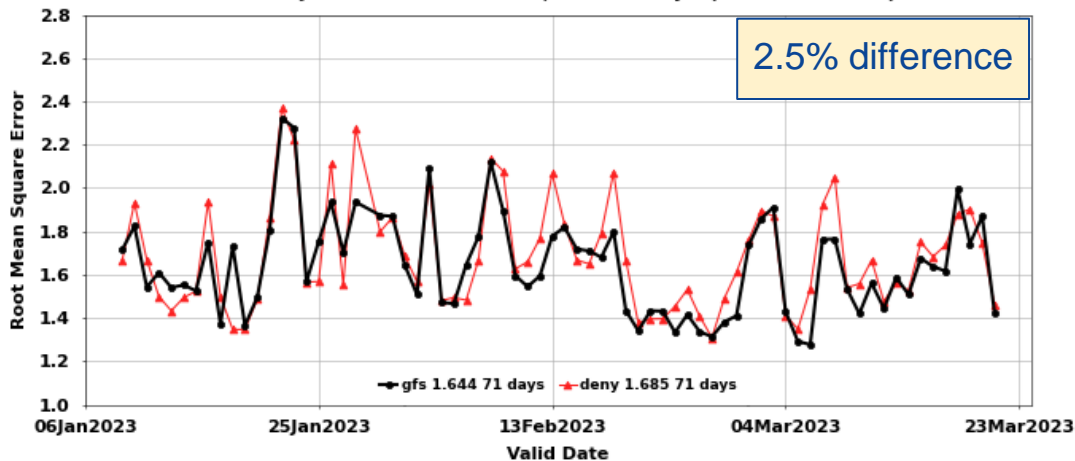


Difference from gfs

Note: differences outside the outline bars are significant at the 95% confidence level



Root Mean Square Error  
200 hPa Temperature (K), Pacific North America  
valid 06Jan2023-24Mar2023 00Z, Forecast Day 3 (Forecast Hour 72)

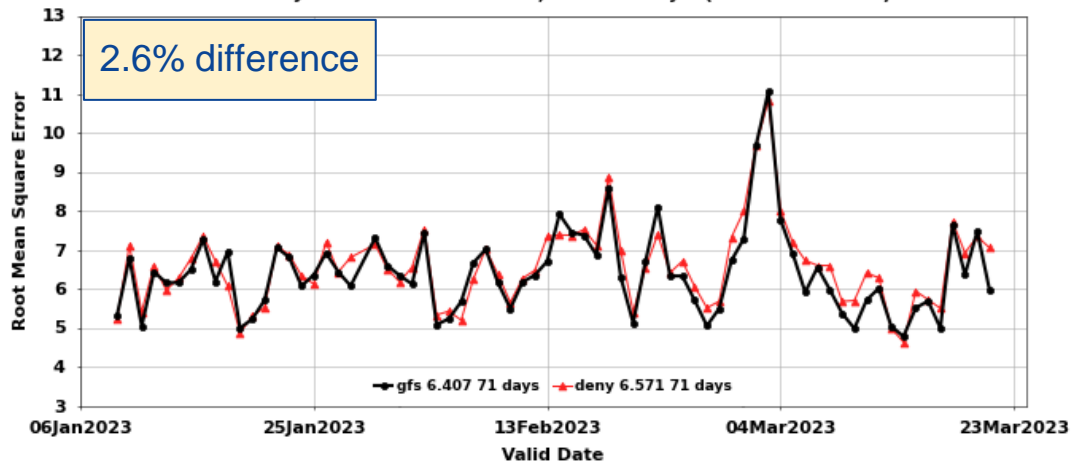


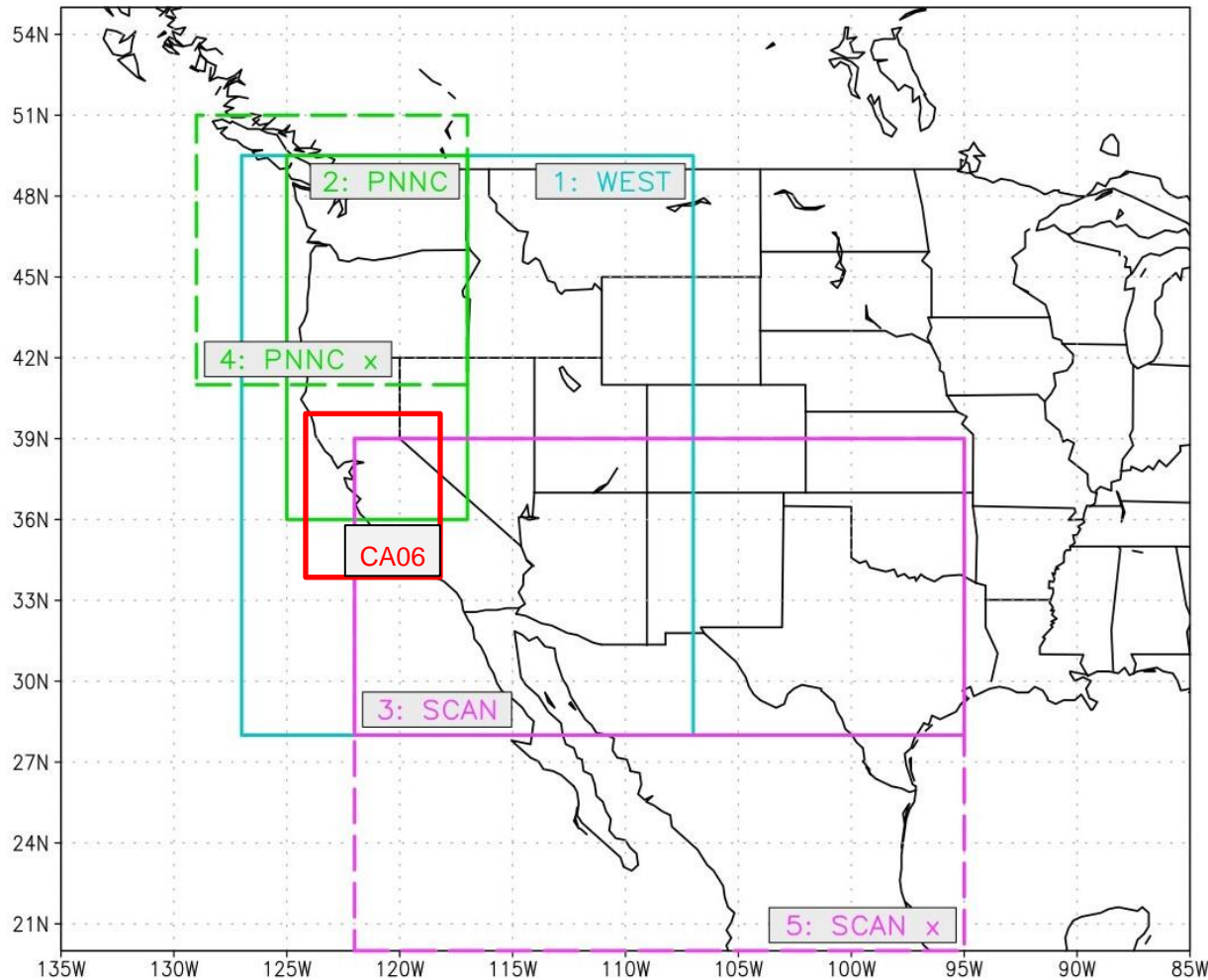
## PNA 72-h RMSE Temp 200 hPa

Improved Forecast with  
dropsonde obs

## PNA 72-h RMSE Wind 200 hPa

Root Mean Square Error  
200 hPa Vector Wind ( $m s^{-1}$ ), Pacific North America  
valid 06Jan2023-24Mar2023 00Z, Forecast Day 3 (Forecast Hour 72)





## Spatial domains for precipitation verifications (Lord et al. 2023. WAF)

West Coast

**WEST: 107-127 W, 28-49.5 N**

Pacific Northwest and Northern California

**PNNC: 117-125 W, 36-49.5 N**

Southern California, Arizona, New Mexico

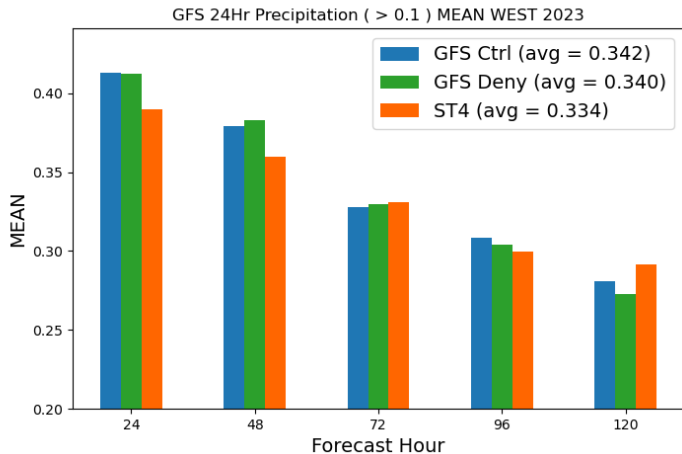
**SCAN: 95-122 W, 28-39 N**

*(Addition here)*

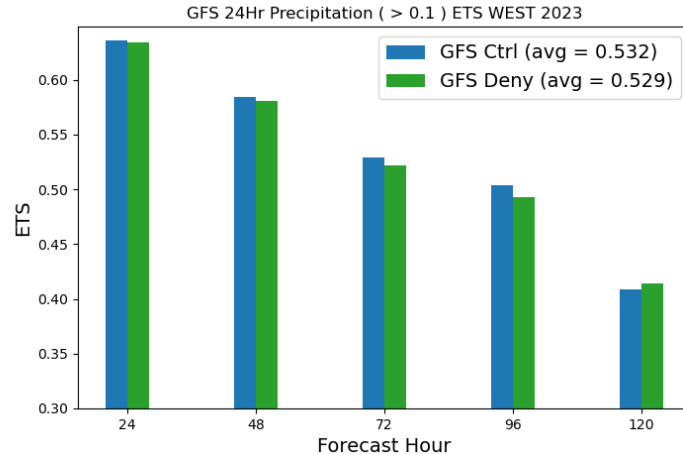
**CA06: 118-124 W, 36-40 N**

**CONUS: The continental U.S.**

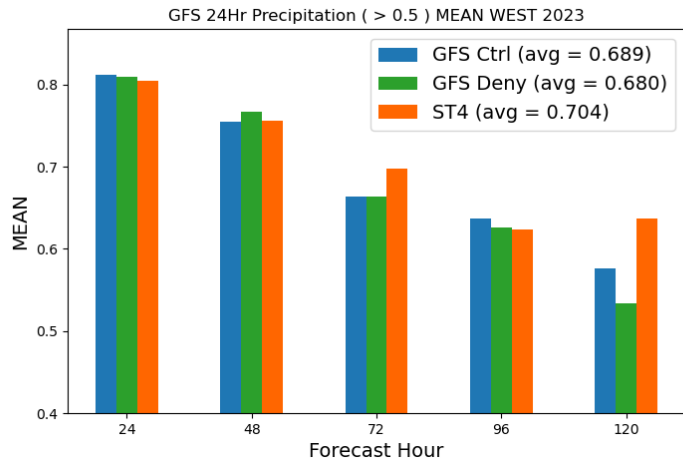
## WEST (>0.1 in) Mean Precipitation



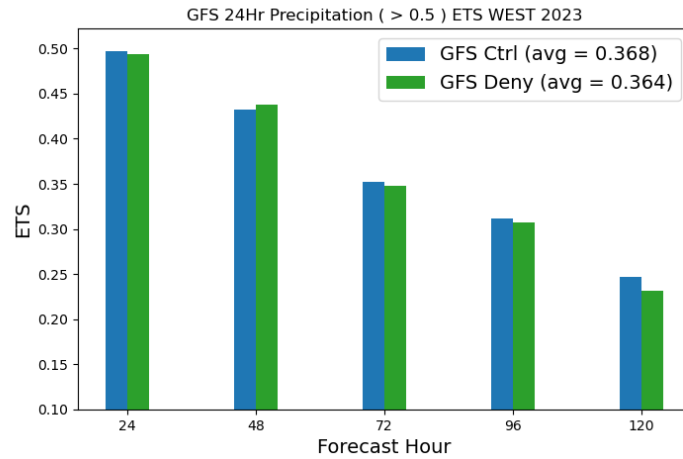
## WEST (>0.1 in) Equitable Threat Score



## WEST (>0.5 in) Mean Precipitation

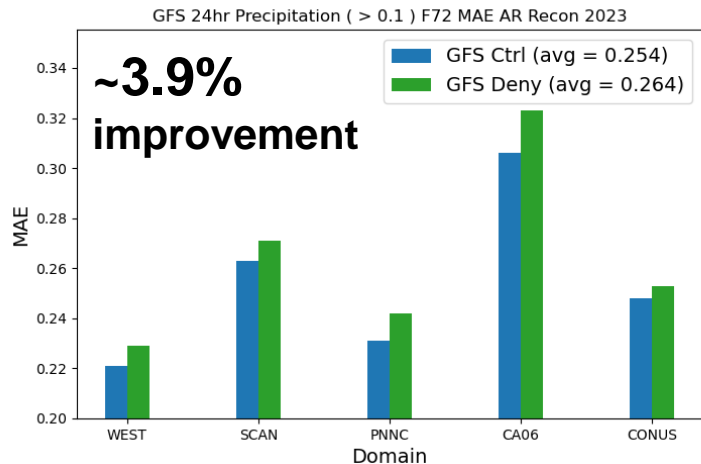


## WEST (>0.5 in) Equitable Threat Score

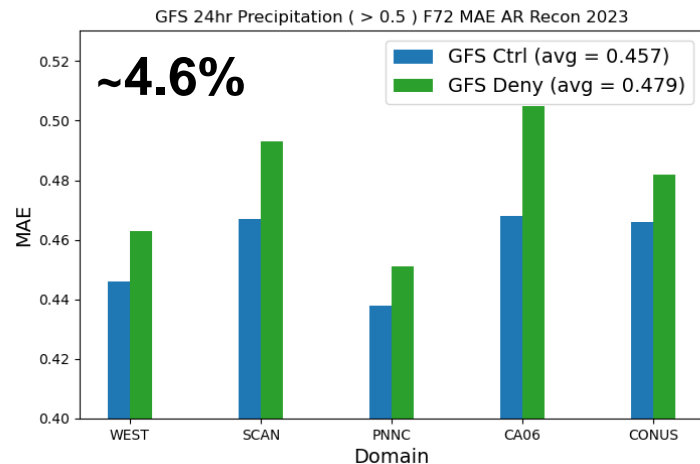




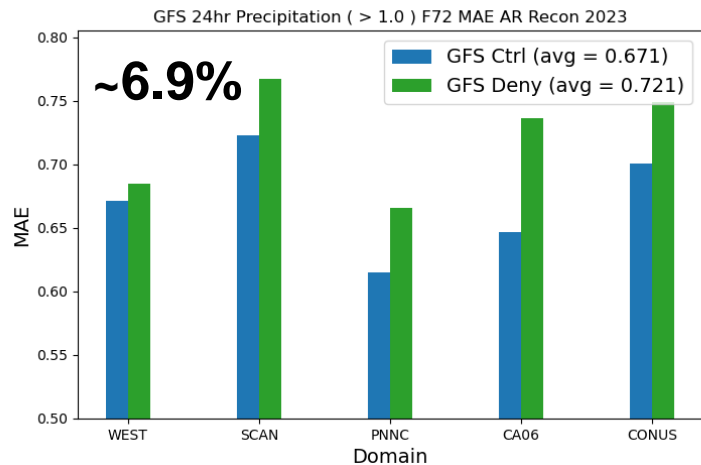
## AR Recon precipitation (>0.1 in) F72 MAE



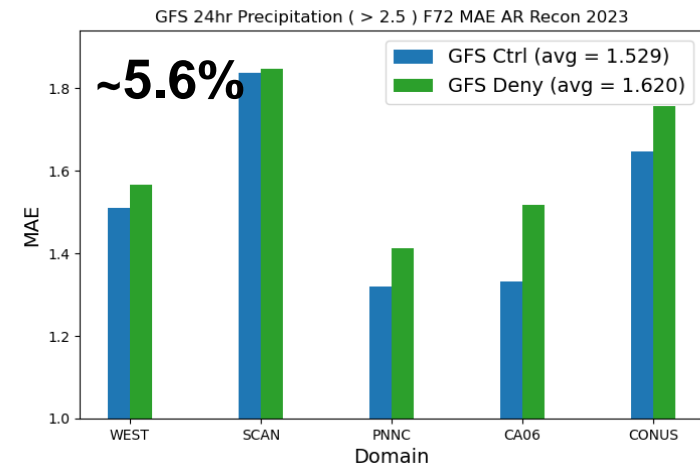
## AR Recon precipitation (>0.5 in) F72 MAE



## AR Recon precipitation (>1.0 in) F72 MAE



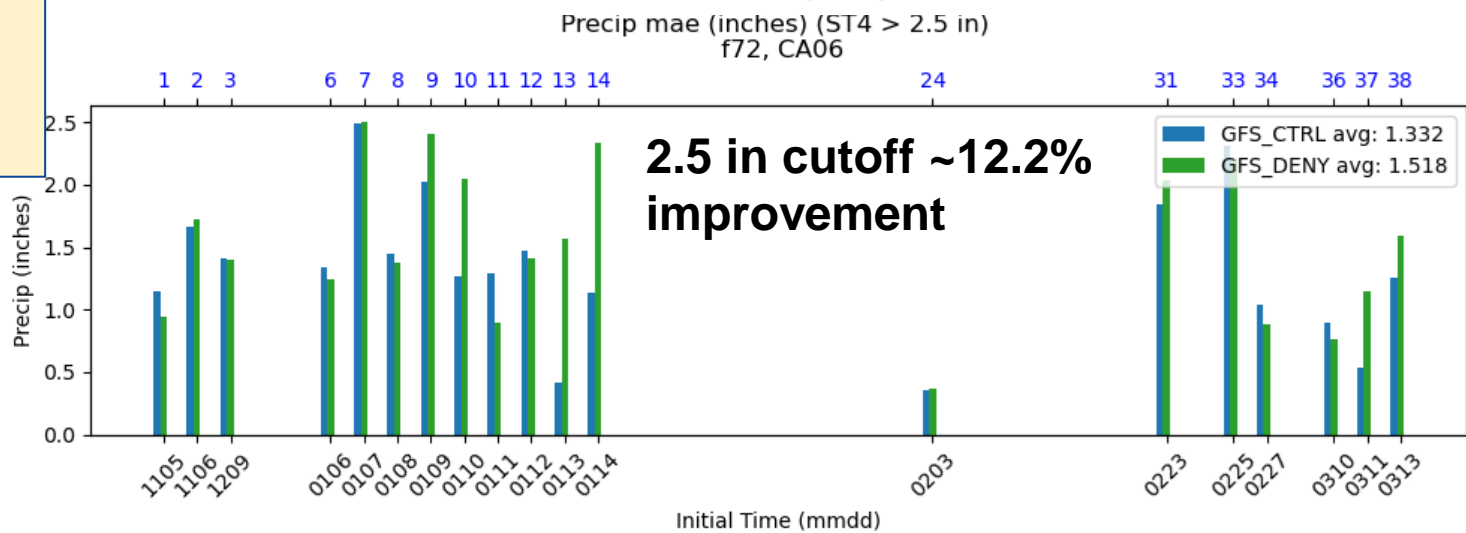
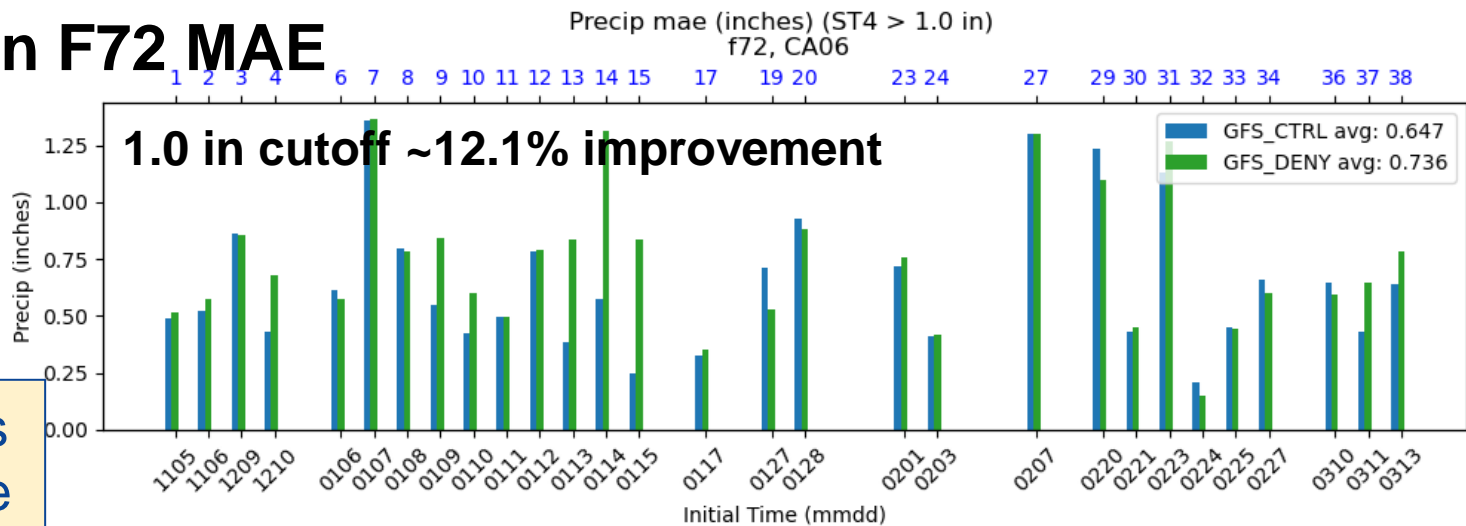
## AR Recon precipitation (>2.5 in) F72 MAE



# Precipitation F72 MAE

## CA06

Dropsonde obs helps to reduce precipitation mae in CTRL



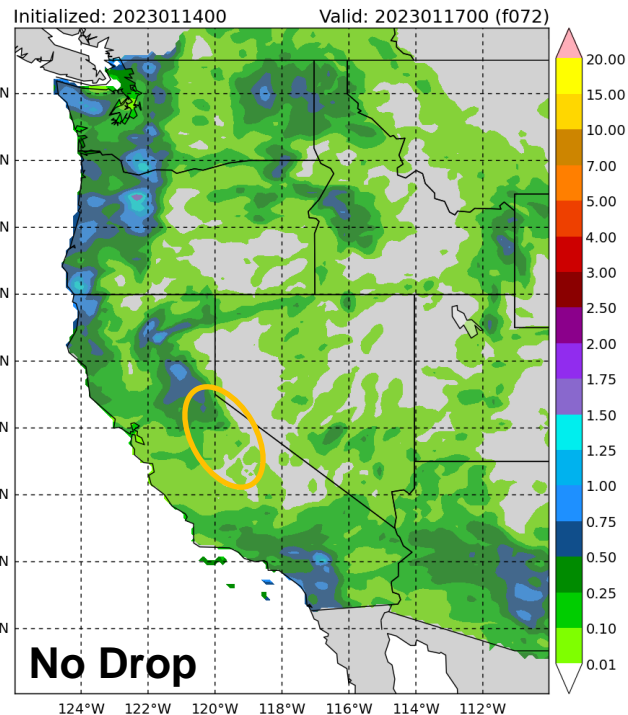
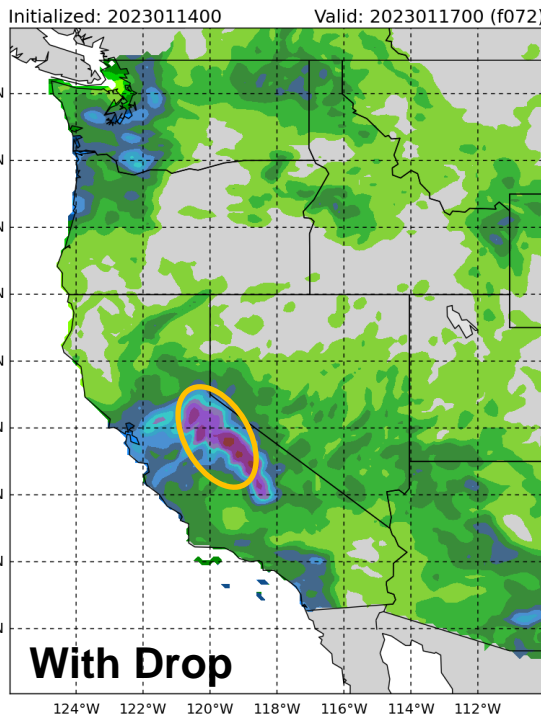
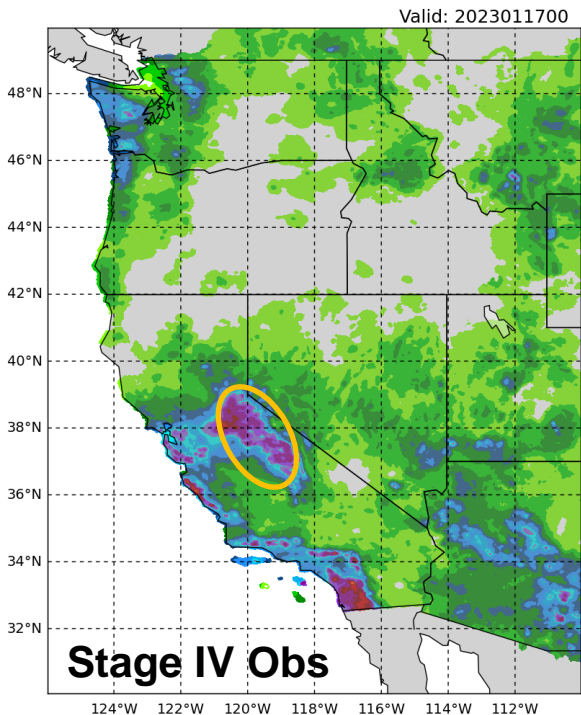
# Case Study: IOP 14 (00Z Jan 14)

## 72-hour forecast, verify at 00Z Jan 17

ST4 24h Total Precipitation (inches)

GFSv16 24h Total Precipitation Ctrl (inches)

GFSv16 24h Total Precipitation Deny (inches)

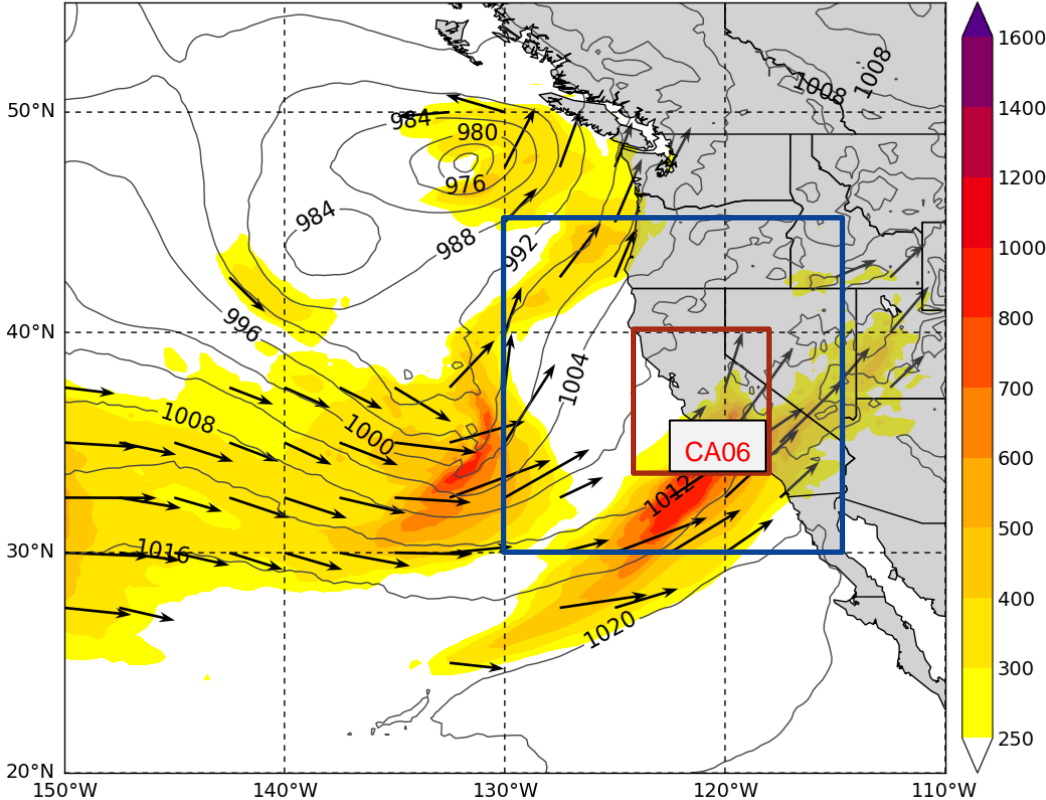




# Forecast MAE Improvement: (Ctrl-Deny)/Deny\*100%

F48 - 39 IOPs: **30N-45N,130W-115W**

GFSv16 IVT, IVT Vector, and SLP (hPa, contours)  
Anl: 2023011000



	IVT	IWV	MSLP
	-1.8	-3.5	-2.7

Level	925	850	700	500	400	300
SPFH	-2.5	-2.4	-4.7	-2.4	1.1	-0.0
WSPD	-0.9	-3.4	-1.9	-2.2	-3.5	-1.1
Z	-2.4	-2.1	-1.4	-0.7	0.2	-1.6
T	-2.4	-3.0	-3.5	0.8	-2.1	-0.9

Positive impacts from the assimilated dropsonde obs for IVT structures, and the field of moisture, wind, geopotential height and temperature.

# IOP 6-18 F72 precipitation MAE

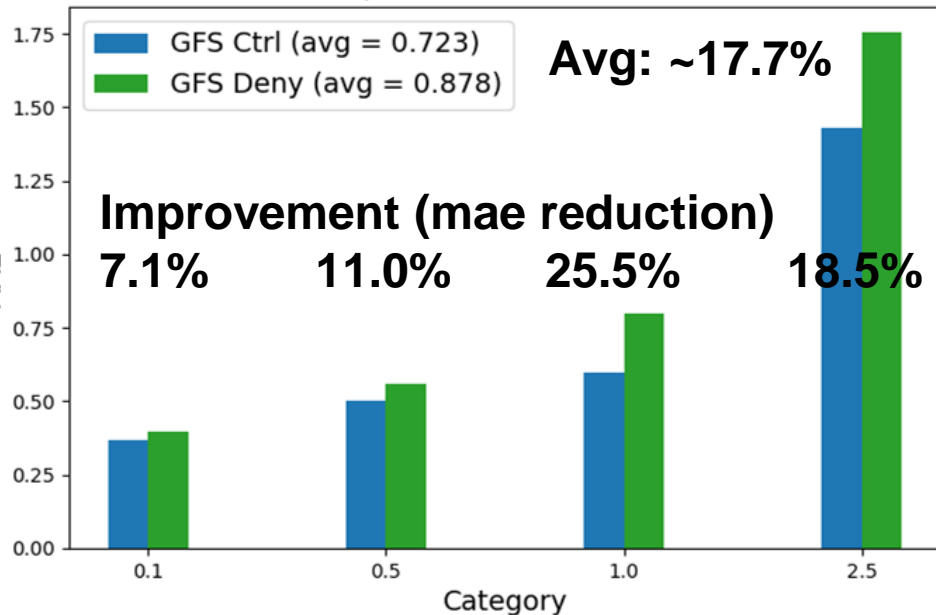
CA06: 34N-40N,124W-118W

# F48 Forecast MAE Improvement:

(Ctrl-Deny)/Deny\*100%

30N-45N,130W-115W

GFS 24hr Precipitation CA06 F72 MAE AR Recon 2023



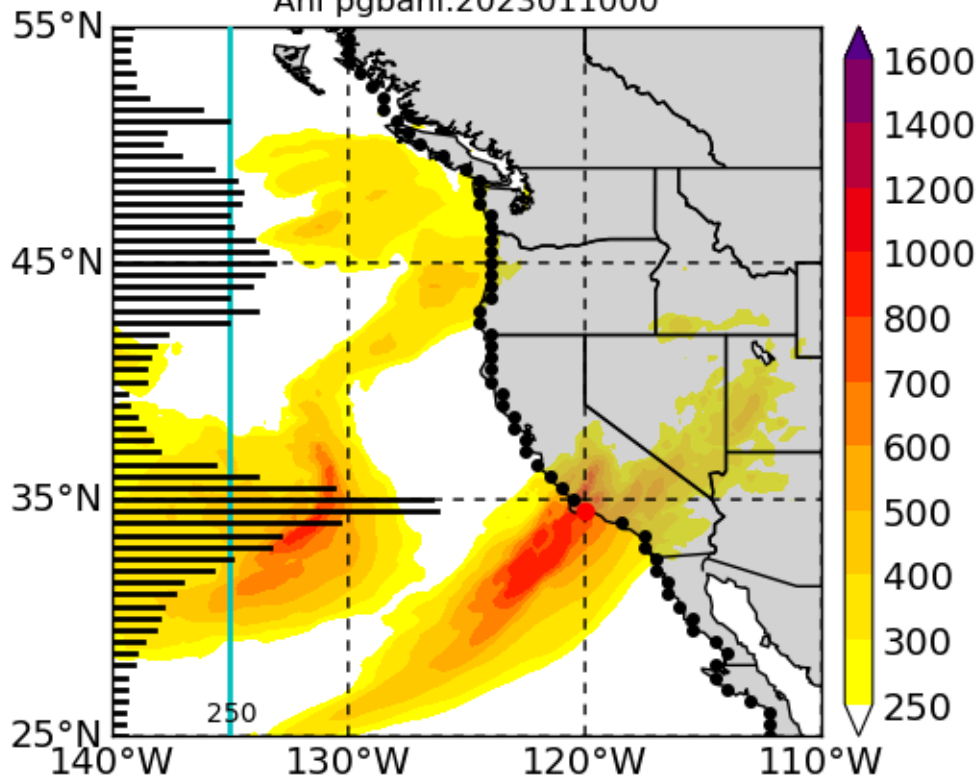
	IVT	IWV	MSLP
	-4.5	-6.9	-10.9

Level	925	850	700	500	400	300
SPFH	-6.5	-7.7	-8.9	-4.4	-2.0	4.3
WSPD	-7.0	-6.0	-7.2	-6.0	-8.0	-2.3
Z	-11.2	-10.9	-7.7	-4.7	-2.1	-1.6
T	-6.3	-7.7	-7.3	-0.8	-1.5	2.4

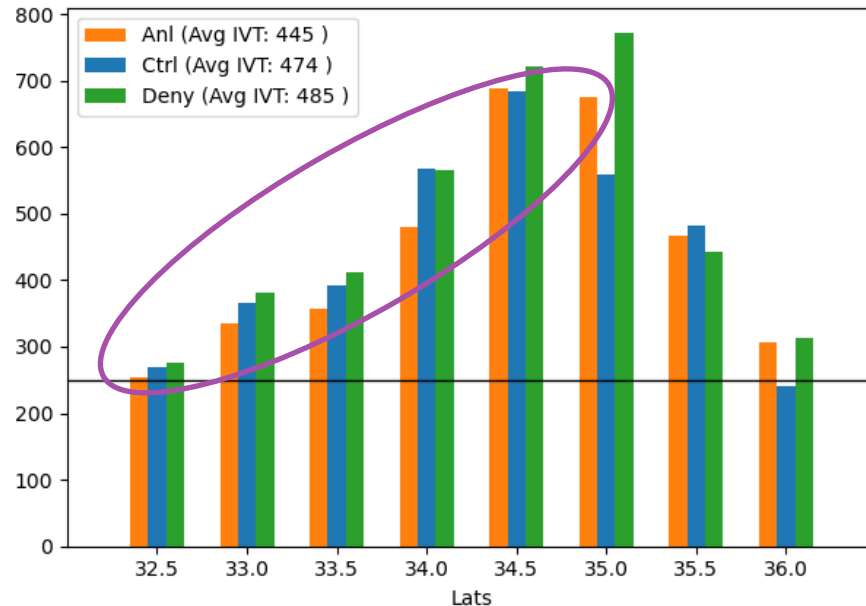
Positive impacts from the assimilated dropsonde obs for CA precipitation, IVT structures, and the field of moisture, wind, geopotential height and temperature.

# AR 2023 Jan 10 Landfall Forecast: GFS IVT Jan 10 00Z

Anl pgbanl.2023011000



IVT at AR landing Coast  
Init: 2023010800, Valid: 2023011000



**The positive impact of the dropsonde data in IVT**



## Summary

- AR dropsonde data help improve GFS forecast over the Pacific North American (PNA, 180-320E 20-75N) due to improvement in GFS analysis.
- There is a positive impact on the GFS forecast skill for the precip over the U.S. West, especially with 72-h lead, along with improved analysis and forecast of moisture, wind, and AR landfall.
- Data gaps associated with ARs can be addressed with targeted AR Recon field campaigns which provide vital observations for improving precipitation forecasts over the U.S. West.

# Thanks for your attention

## GFSv16 and data denial

Precipitation: [https://www.emc.ncep.noaa.gov/gc\\_wmb/wd20xw/GFSv16\\_prec24h](https://www.emc.ncep.noaa.gov/gc_wmb/wd20xw/GFSv16_prec24h)

Precipitation Bias: [https://www.emc.ncep.noaa.gov/gc\\_wmb/wd20xw/GFSv16\\_prec24hDmC](https://www.emc.ncep.noaa.gov/gc_wmb/wd20xw/GFSv16_prec24hDmC)

IVT/IWV: [https://www.emc.ncep.noaa.gov/gc\\_wmb/wd20xw/GFSv16\\_AR2023](https://www.emc.ncep.noaa.gov/gc_wmb/wd20xw/GFSv16_AR2023)

IVT/IWV bias: [https://www.emc.ncep.noaa.gov/gc\\_wmb/wd20xw/GFSv16\\_AR2023\\_FmA](https://www.emc.ncep.noaa.gov/gc_wmb/wd20xw/GFSv16_AR2023_FmA)

IVT/IWV difference (Deny/Ctrl): [https://www.emc.ncep.noaa.gov/gc\\_wmb/wd20xw/GFSv16\\_AR\\_DmC](https://www.emc.ncep.noaa.gov/gc_wmb/wd20xw/GFSv16_AR_DmC)

## Acknowledgements: AR Recon Team

# Questions?

