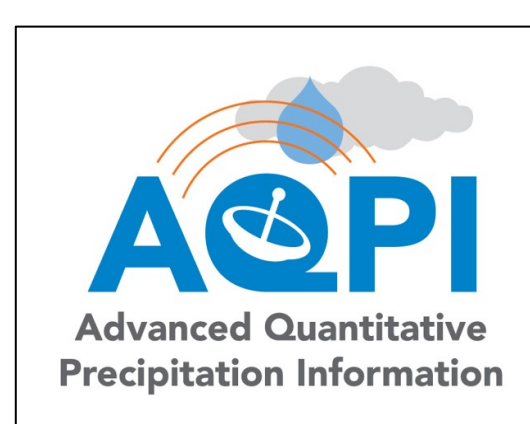


# AQPI: RAP/HRRR Model Forecasts of Atmospheric River Events over the San Francisco Bay Area

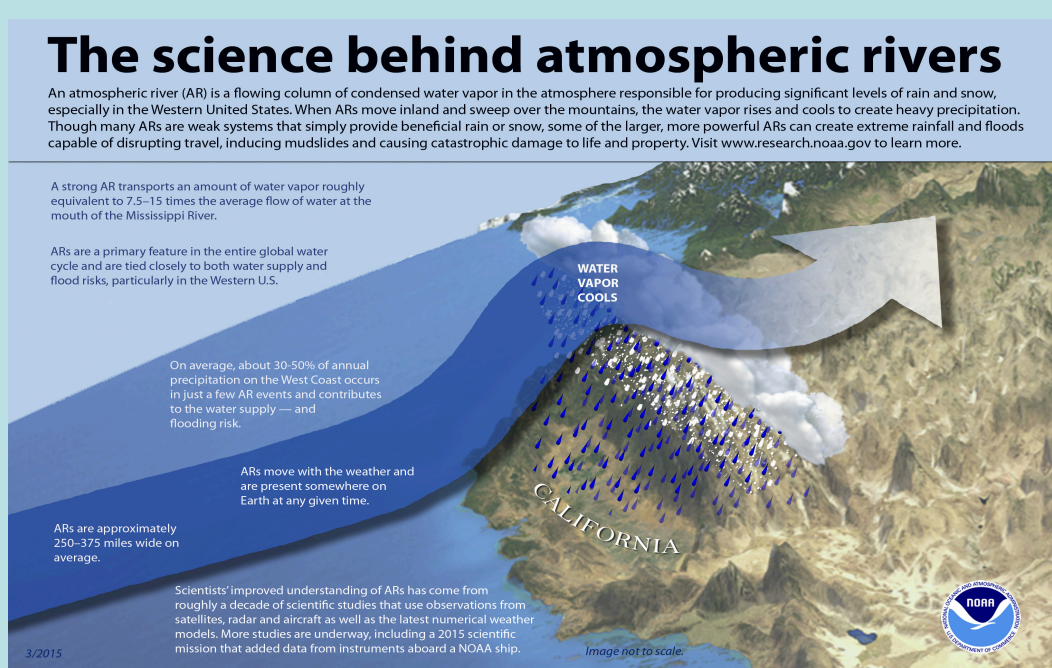


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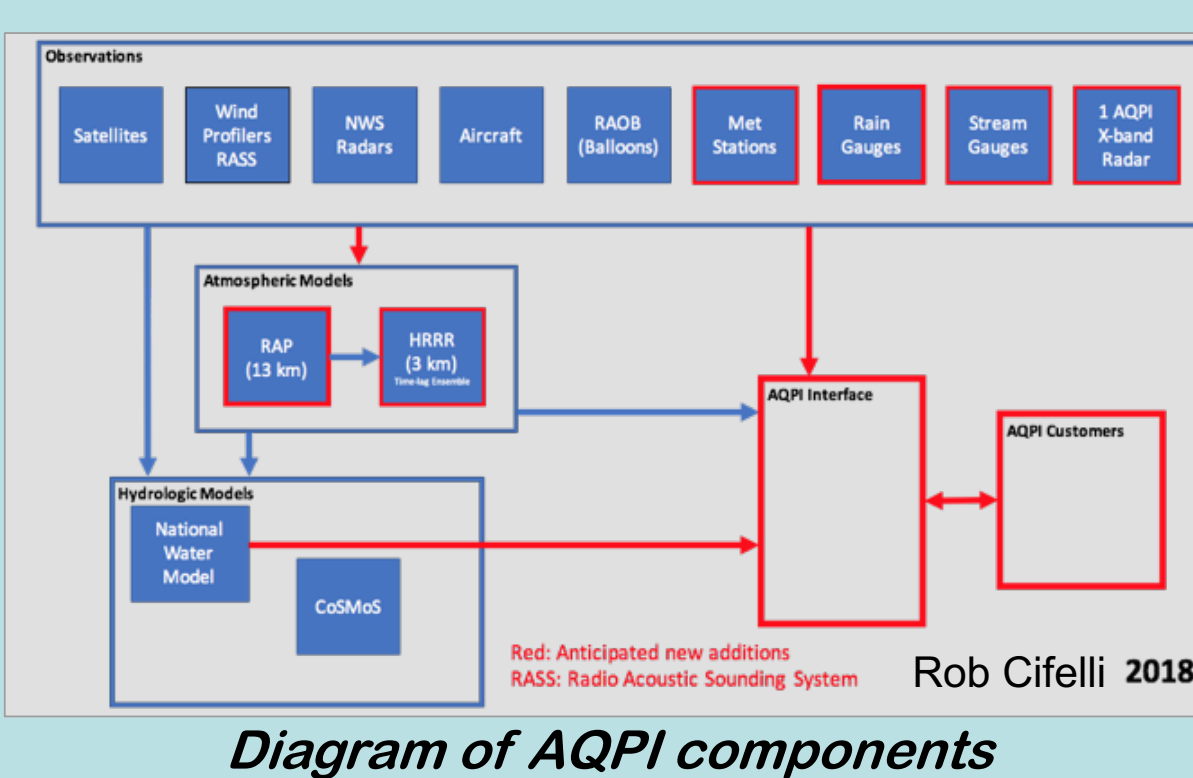
## 1. Introduction

- Atmospheric Rivers (ARs) transport moisture from the tropics and bring heavy rain to higher latitudes
- ARs are responsible for roughly 40% of California's annual precipitation
- Better forecasts of rain timing/intensity, streamflow, reservoirs, and storm surge can minimize human, ecosystem, & economic impacts



## 2. The AQPI Project

- Goal of AQPI (Advanced Quantitative Precip. Info): improve California early warning through research transition, monitoring, and prediction of precipitation, streamflow, and storm surge
- Deploy & assimilate AQPI radar & sfc met instruments; evaluate model predictions of precipitation, streamflow, and storm surge
- 4-year grant awarded by the DWR to multiple partners: NOAA, CSU, USGS, DWR, and NWS



## 3. NOAA GSD Research Plan

**NOAA GSD Role:** Evaluate/improve QPF from RAP/HRRR model over AQPI region

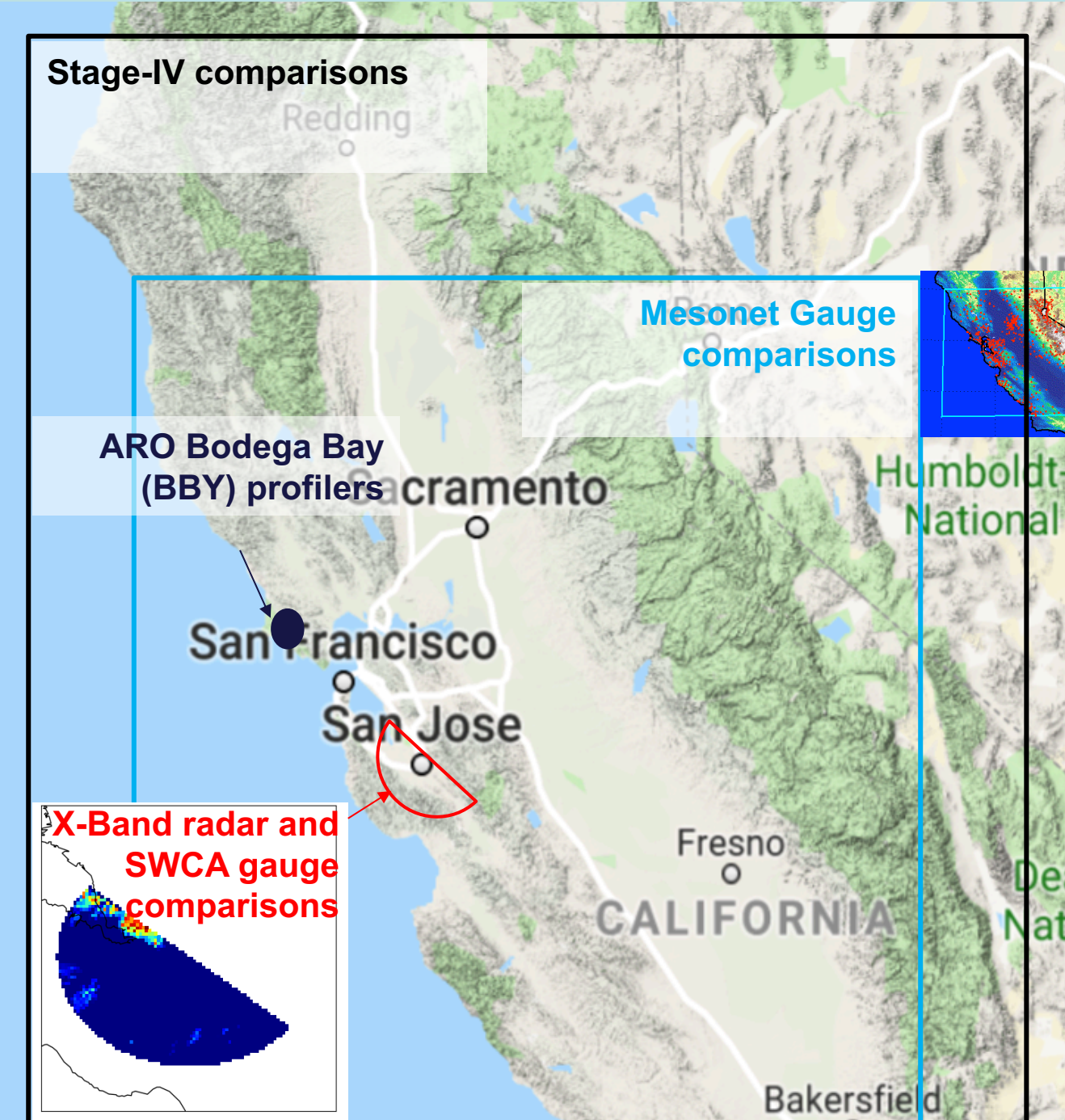
**Science Question:** How well do different versions of the RAP/HRRR model forecast various AR events over California?

**Approach:**

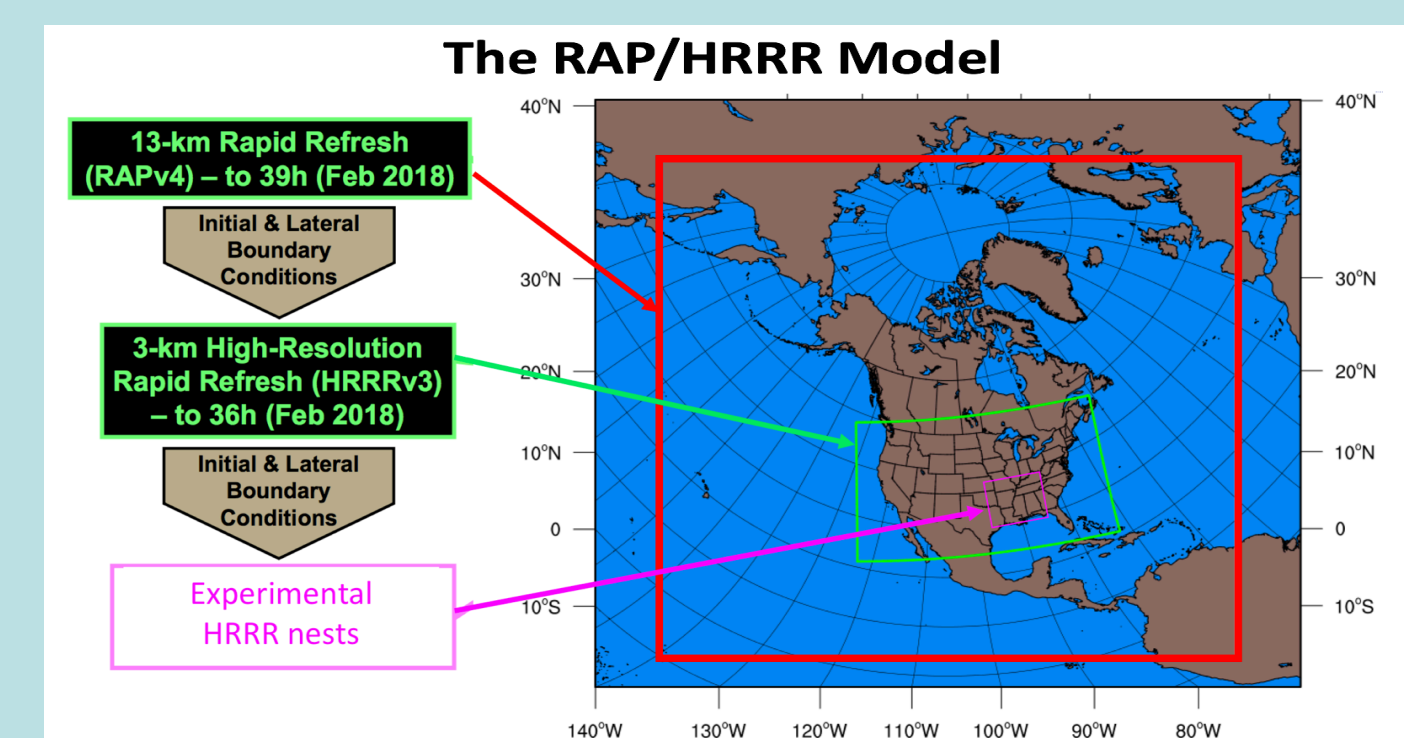
- Select 6-8 AR events that have occurred
- Download operational & real-time-X RAP/HRRR output, & run retrospective simulations with the latest RAP/HRRR model version
- Compare model forecasts of precip and other metrics to available observations

**Metrics:**

- Precip (Model QPF vs Observed QPE): Stage-IV; Mesonet contingency tables; San Jose X-band domain
- Winds, T, water vapor: PSD ARO Profilers (Bodega Bay, Pt Sur)



## 4. RAP/HRRR Model Versions



- RAP/HRRR is a high-resolution mesoscale model for short-term weather forecasts (0-36h)
- NOAA/ESRL/GSD develops improved versions of RAP/HRRR and release them to NCEP operations every ~2 years
- Currently RAPv4/HRRRv3 is operational; RAPv5/HRRRv4 is under development

Model Version	Operational Dates	Notable Improvements
RAPv3/HRRRv2	Aug-2016 to Jul-2018	Aerosol Thompson Microphysics, MYNN PBL updates, RUC Land Sfc Model, RRTMG Radiation, Grell-Freitas cumulus, improved 2m T/Td background est.
RAPv4/HRRRv3	Jul-2018 to Present	Hybrid vertical coordinates, Thompson microphysics (UL clouds), MYNN PBL updates, full geometric diffusion (better winds/temp in terrain), some new obs/DA methods
RAPv5/HRRRv4	Scheduled Jun-2020	Latest Grell-Freitas convection (RAP only), MYNN PBL updates, enhanced GW drag, some new obs/DA methods

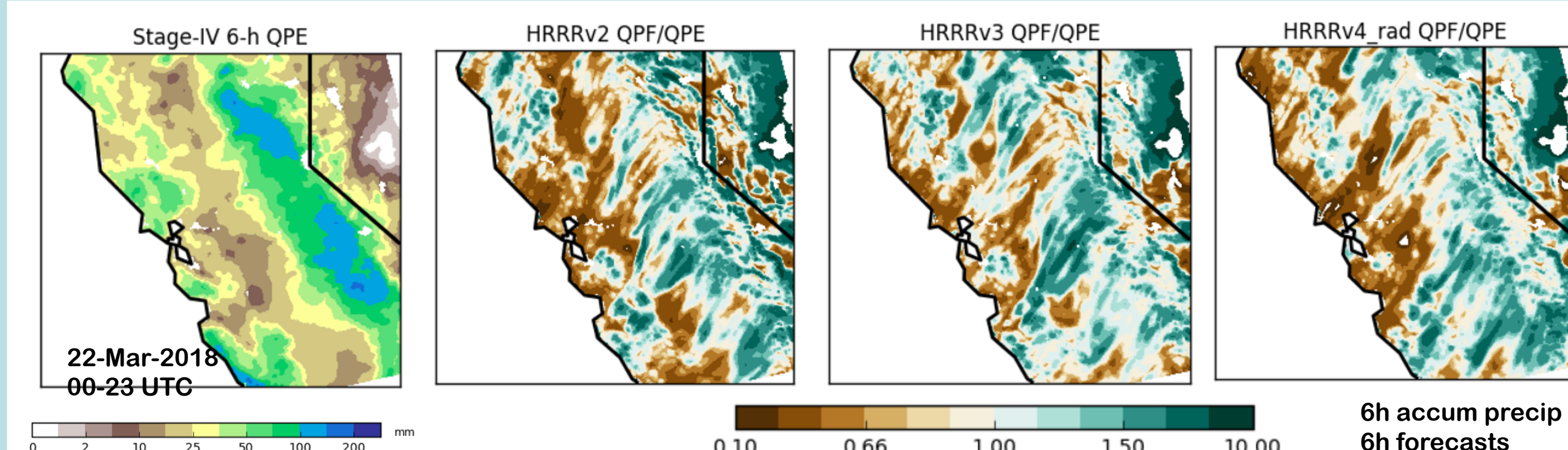
### Experimental Design (AR Events Studied)

Event	Operational Case Name	Real-Time X Case Name*	Final-X Case Name*	Additional X Retros*
22-Mar-2018	HRRRv2	---	---	HRRRv4_rad
2-Feb-2019	HRRRv3	HRRRv4_GSD	HRRRv4_rc1	---
14-Feb-2019	HRRRv3	HRRRv4_GSD	HRRRv4_rc1	HRRRv4_feb19
26-Feb-2019	HRRRv3	HRRRv4_GSD	HRRRv4_rc1	---

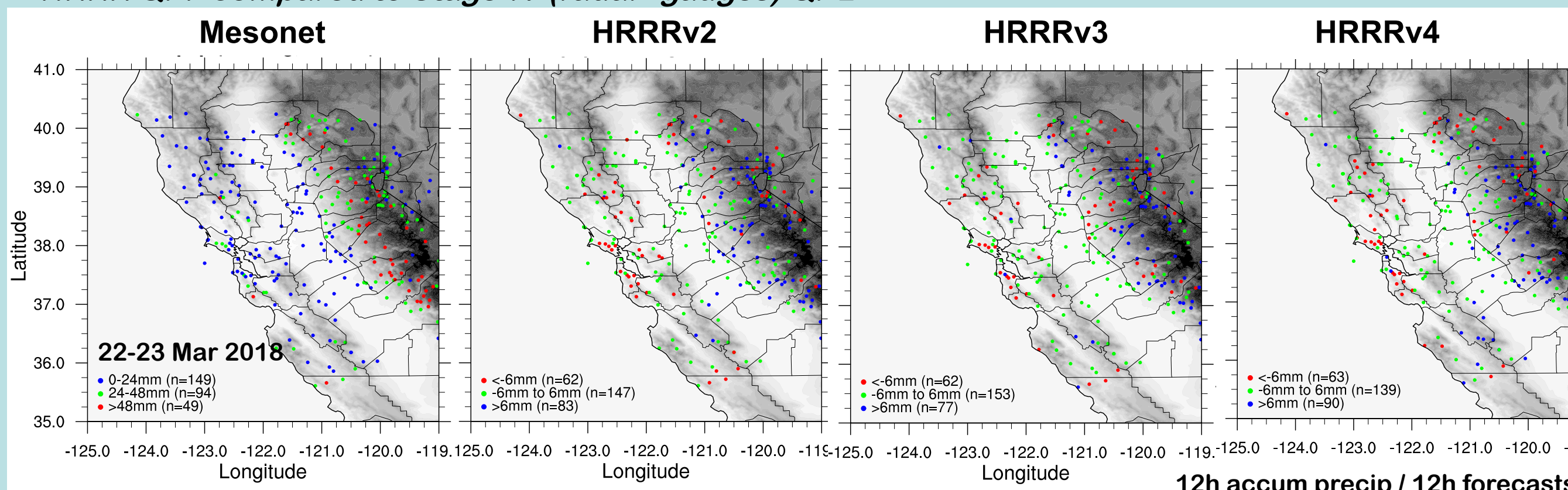
\*Real-time X is continuously evolving. Final-X is the frozen version for NCEP implementation which occurred Fall 2019. Additional X retros were based on Fall 2018 code and assimilation dependent upon obs available for each event (22-Mar-18 has 5 radiances types; 14-Feb-19 has 16)

## 5. Case Study: 22-Mar-2018

### A. QPF/QPE Comparisons (Stage-IV & Mesonet)



HRRR QPF compared to Stage-IV (radar+gauges) QPE



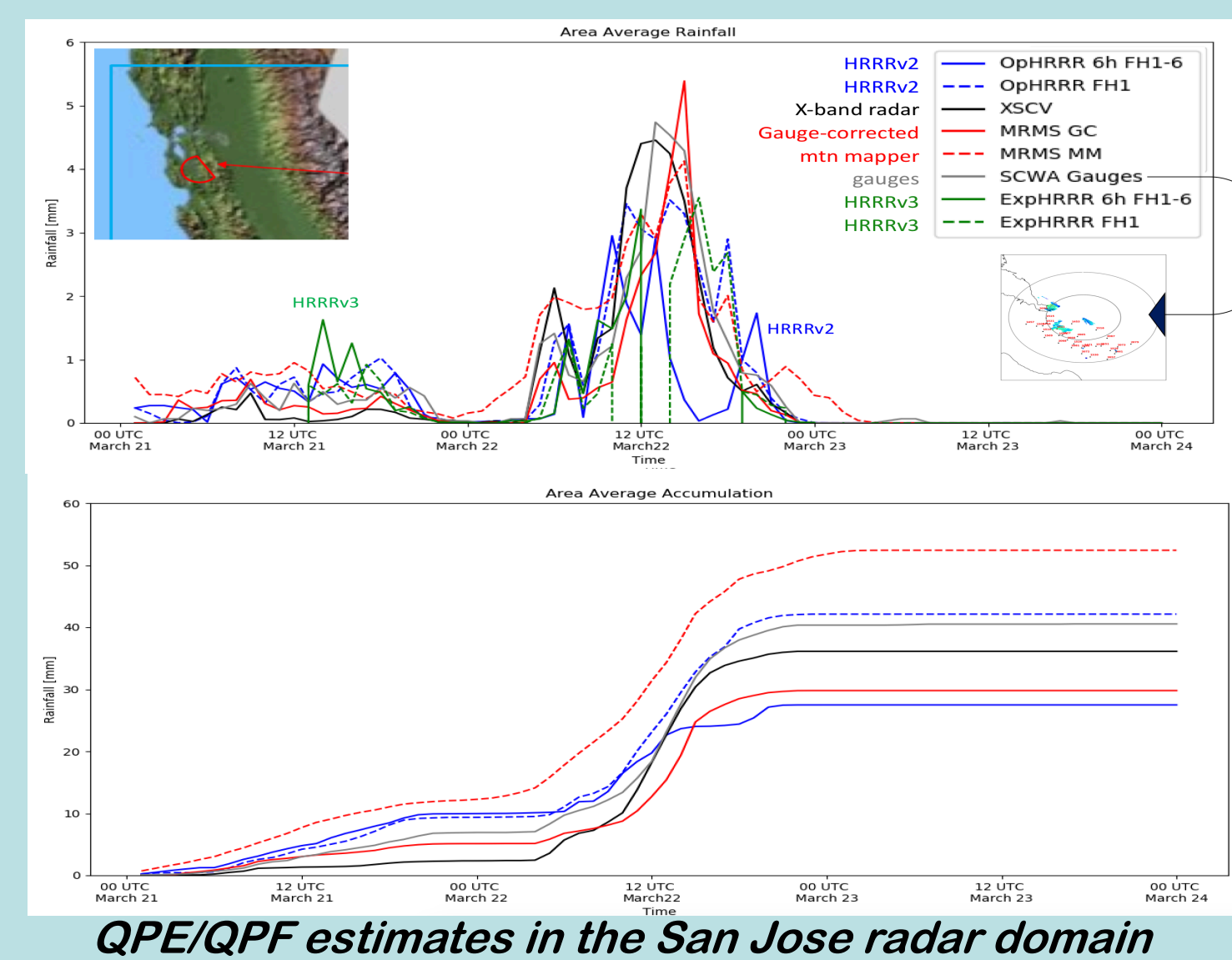
HRRR QPF compared to Mesonet gauges (closest model grid point) (292 gauges included)

Contingency Tables (vs Mesonet)						
time_acc (h)	threshold (mm)	Domain	Model	avg (mm)	TS/CSI	ETS/GSS
6	20	All	Mesonet	18.2	1	1
			HRRRv2	19.7	0.572	0.391
			HRRRv3	19.1	0.581	0.402
			HRRRv4	20.1	0.546	0.355
6	20	0-1000m	Mesonet	14.8	1	1
			HRRRv2	12.6	0.437	0.323
			HRRRv3	13.6	0.466	0.348
			HRRRv4	14.0	0.402	0.273
6	20	1000-3000m	Mesonet	23.1	1	1
			HRRRv2	29.7	0.664	0.358
			HRRRv3	27.0	0.663	0.368
			HRRRv4	28.7	0.654	0.348

Given categories: Observed Yes/No, Model Yes/No. Threat Score (Critical Success Index) = Hits / (hits + misses + false alarms). Equitable Threat Score (Gilbert Skill Score) = (Hits - random\_hits) / (hits + misses + false alarms + random\_hits)

- NWS Stage-IV and Mesonet gauges measure significant rainfall over the Pacific Coast and Sierra Nevadas
- All HRRR versions generally capture the spatial extent, but predict too little rainfall in the Bay Area, and too much rainfall over the Sierra Nevadas
- Threat Score (TS) and Equitable Threat Score (ETS) are higher (better) at higher elevations, because the large-scale forcing is easier to model
- HRRRv3 seems to perform the best, but differences are small

### B. QPE/QPF Comparisons in the San Jose Area

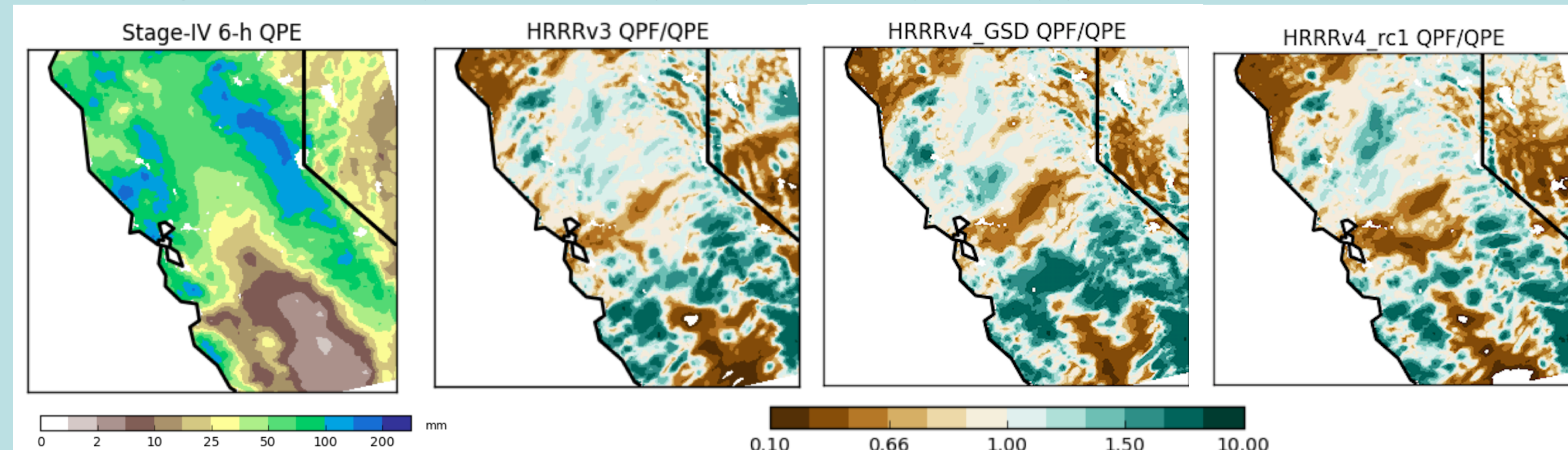


QPE/QPF estimates in the San Jose radar domain

- Both HRRRv2 and HRRRv3 overestimate rainfall in the first event (21-Mar); underestimate the "main event" (22-Mar)
- Area average accumulation varies widely between various QPE (Quantitative Precipitation Estimation) sources, highlighting the challenges with trying to understand precip
- QPE from the San Jose X-band radar falls in the middle of the pack of QPE estimates

## 6. Case Study: 14-Feb-2019

### A. Stage-IV Comparisons (6h accum precip)



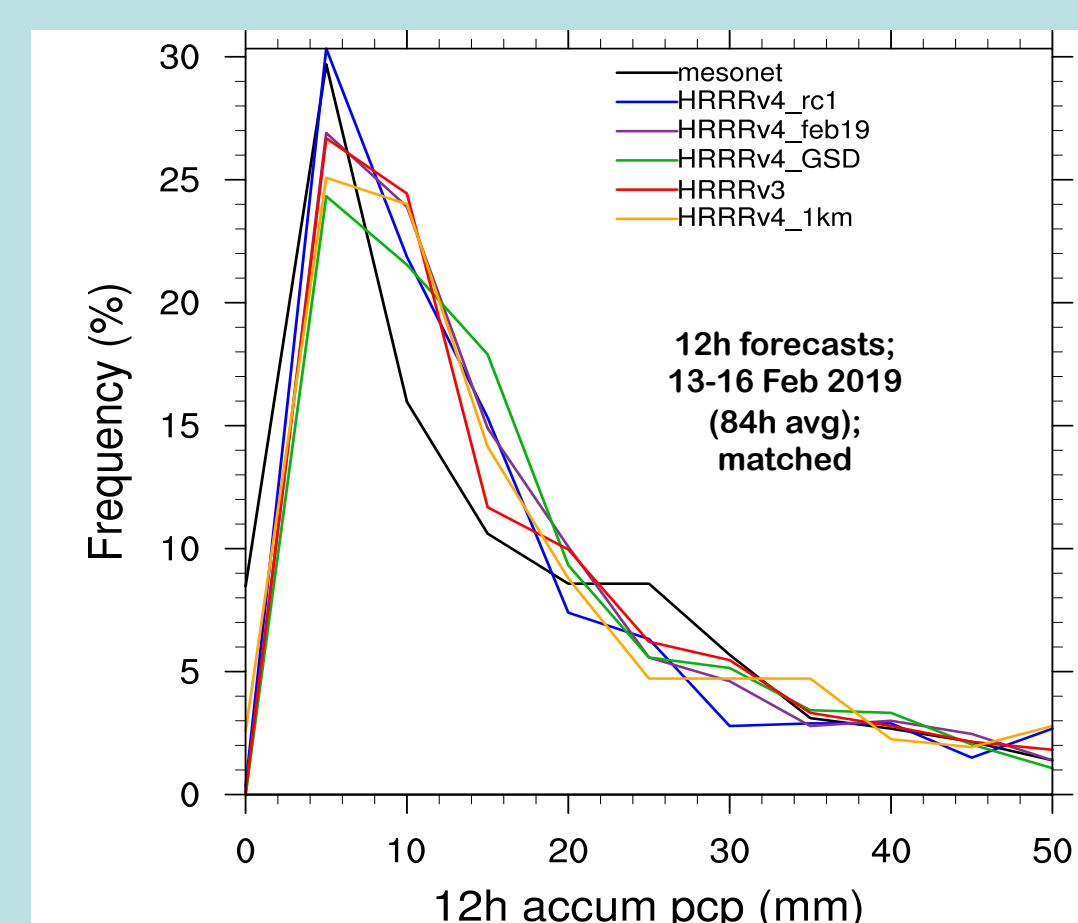
HRRR precip compared to Stage-IV 6h accumulations from 14-15 Feb 2019 (radar+gauges)

- All HRRR versions predict rainfall very well in the north, but in the south tend to overpredict rainfall at high elevation, and underpredict at low elevation, similar to the 22-Mar-2018 case
- Small differences between the HRRR versions. The newest HRRR-X (HRRRv4\_rc1) is drier than previous versions, improving comparisons in some regions while degrading in others

## 6. Case Study: 14-Feb-2019 (cont'd)

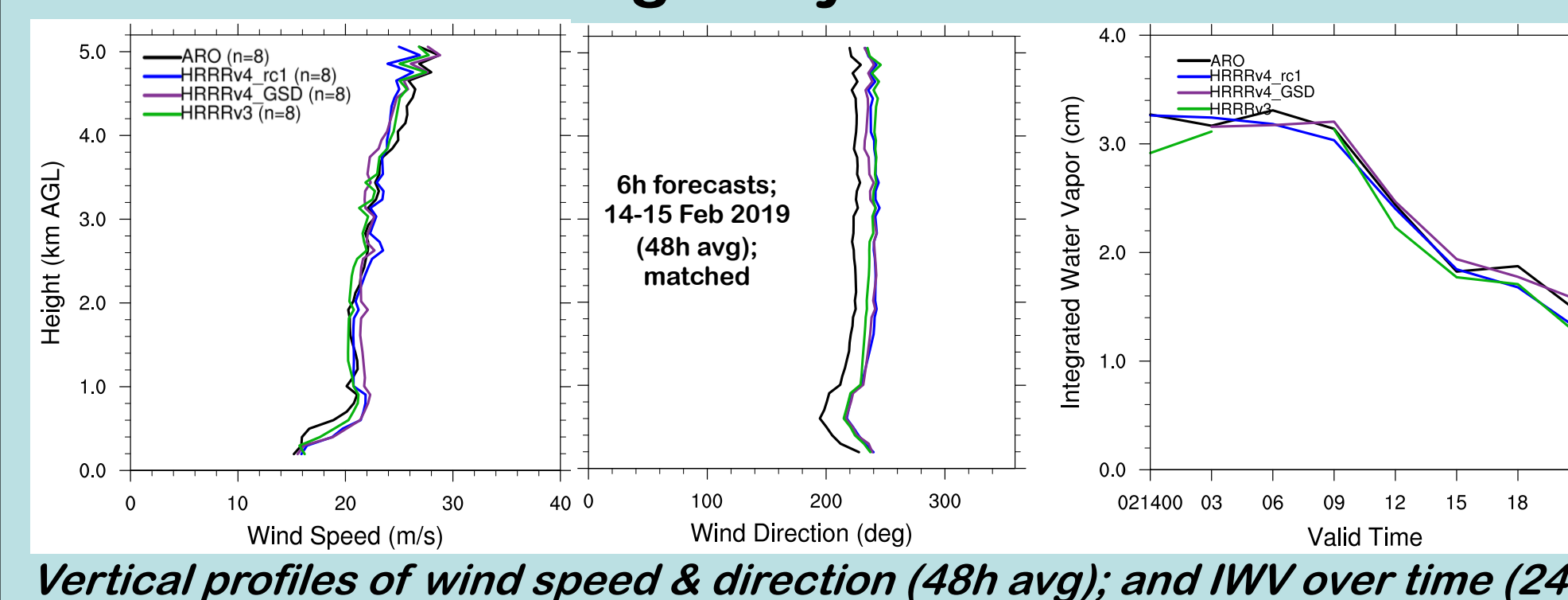
### B. Mesonet Gauge Comparisons

time_acc (h)	threshold (mm)	Domain	Model	avg (mm)	TS/CSI	ETS/GSS
12	10	All	Mesonet	13.4	1	1
			HRRRv3	15.5	0.627	0.416
			HRRRv4_GSD	15.8	0.626	0.410
			HRRRv4_feb19	15.6	0.607	0.388
12	10	0-1000m	Mesonet	12.3	1	1
			HRRRv3	11.5	0.667	0.508
			HRRRv4_GSD	12.1	0.671	0.508
			HRRRv4_feb19	11.6	0.642	0.475
12	10	1000-3000m	Mesonet	16.1	1	1
			HRRRv3	25.8	0.564	0.215
			HRRRv4_GSD	25.4	0.554	0.198
			HRRRv4_feb19	25.9	0.553	0.195
12	10	1000-3000m	HRRRv4_rc1	26.3	0.556	0.195



- As with the 22-Mar-2018 event, all HRRR versions have a wet bias at high elevations
- Small differences between HRRR versions
- Evaluations with 6h acc have similar results (not shown)
- Gauge spatial plots also show small differences (not shown)
- A PDF of accumulated precip shows that all HRRR versions underpredict <10mm thresholds and overpredict 15-20mm thresholds
- All HRRR versions are similar (including the 1km HRRR nest) (standard HRRR is 3km)

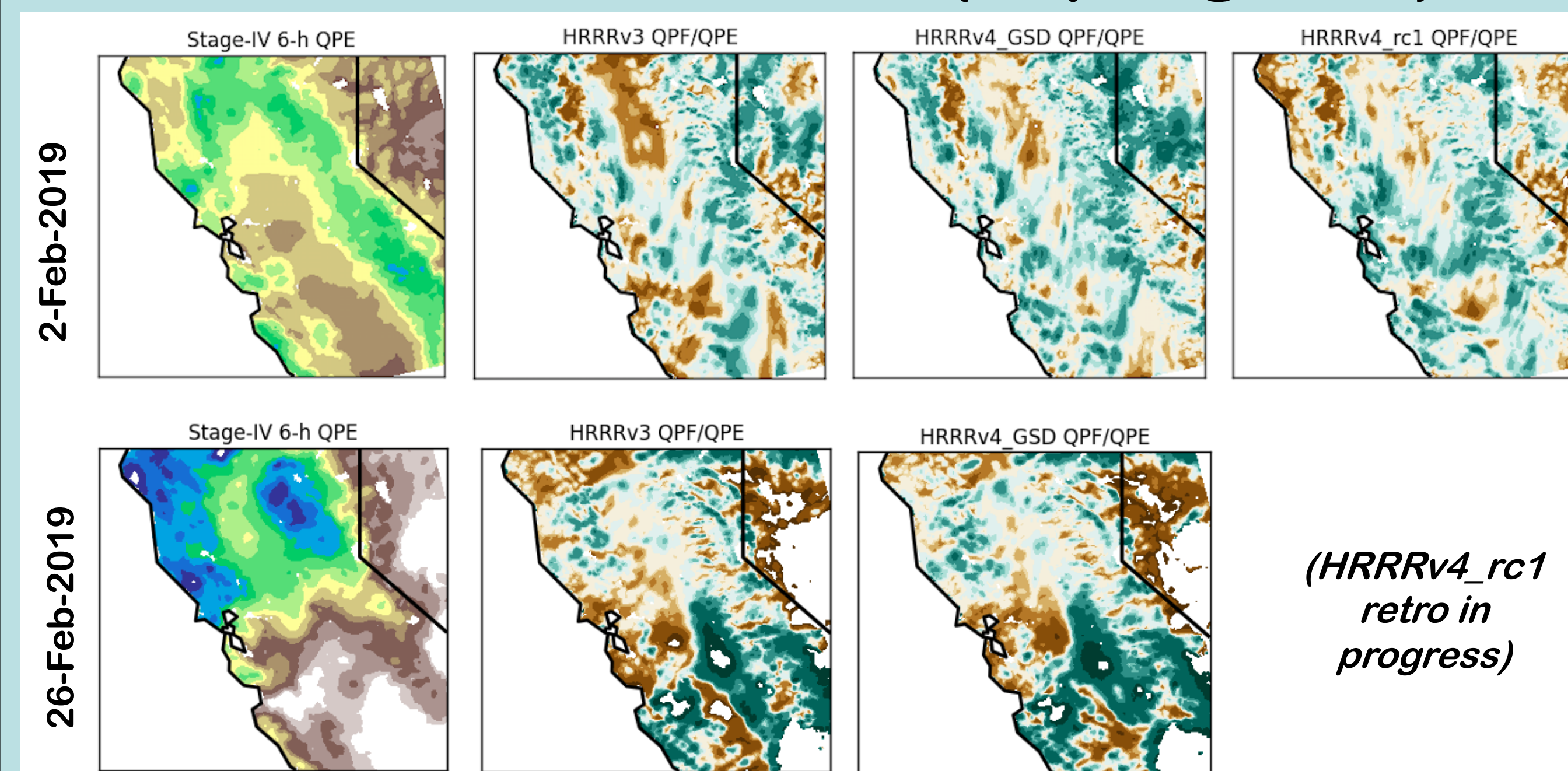
### C. PSD ARO Bodega Bay Wind Profiles



Vertical profiles of wind speed & direction (48h avg); and IWV over time (24h)

- Winds too strong near the surface; too weak aloft; too easterly, but mostly compare well
- IWV compares well
- Biases are similar across all three versions of the HRRR evaluated

## 7. Additional Cases (in progress)



- For 2-Feb, QPF for both HRRR versions compare favorably to Stage-IV; HRRRv4 better
- For 26-Feb, QPF for both HRRR versions compare well in the north but a wet bias in the south
- As with previous cases, HRRR generally has a wet bias at high altitudes and dry bias at low altitudes (with some exceptions)

## 8. Summary

- QPF evaluated for four AR events for multiple models (HRRRv2, HRRRv3, HRRRv4) against multiple precip measurements (X-band & MRMS radars, Mesonet & SWCA gauges, Stage-IV) and Bodega Bay Profilers
- All versions of the HRRR generally predict rainfall spatial distribution and accumulation well, but tend to overpredict high altitude regions and underpredict low altitude regions
- HRRRv4 outperforms HRRRv3 in some but not all cases
- QPE measures vary widely, highlighting challenges with evaluating models

## 9. Next Steps

- Further explore causes of model biases; compare to additional observations (More ARO sites; Oakland soundings; satellite precipitable water)
- Conduct HRRR retros with and without local X-band radar in the data assimilation to understand its value for improving HRRR forecasts
- Evaluate an additional 2-4 cases to understand statistics