

# Evaluating Stochastic Parameter Perturbations in High-Resolution Rapid Refresh Ensemble (HRRRE) Forecasts of Mixed-Precipitation Events

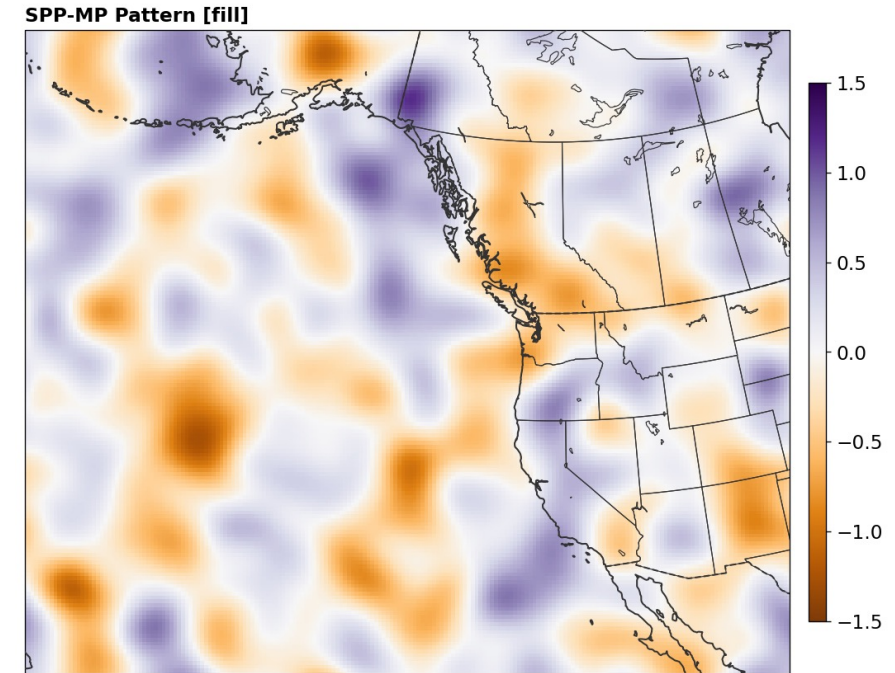
W. Massey Bartolini, Justin R. Minder  
*University at Albany, SUNY*

David Dowell, Isidora Jankov, Trevor Alcott  
*NOAA/GSL*

This research is supported by  
NOAA Grant #NA19OAR4590136

# Introduction

- Motivation: exploring use of stochastic parameter perturbations (SPP) to improve ensemble prediction of winter precip. using High-Resolution Rapid Refresh Ensemble (HRRRE) framework
  - Using SPP, able to vary known uncertain parameters using physically-motivated range of values
  - Focus on SPP in planetary boundary layer (SPP-PBL) and microphysics (SPP-MP) schemes
- Future: U.S. modeling community heading toward single-physics ensemble (i.e., RRFS), once skill is competitive with multi-physics, multi-dycore ensemble (HREF)

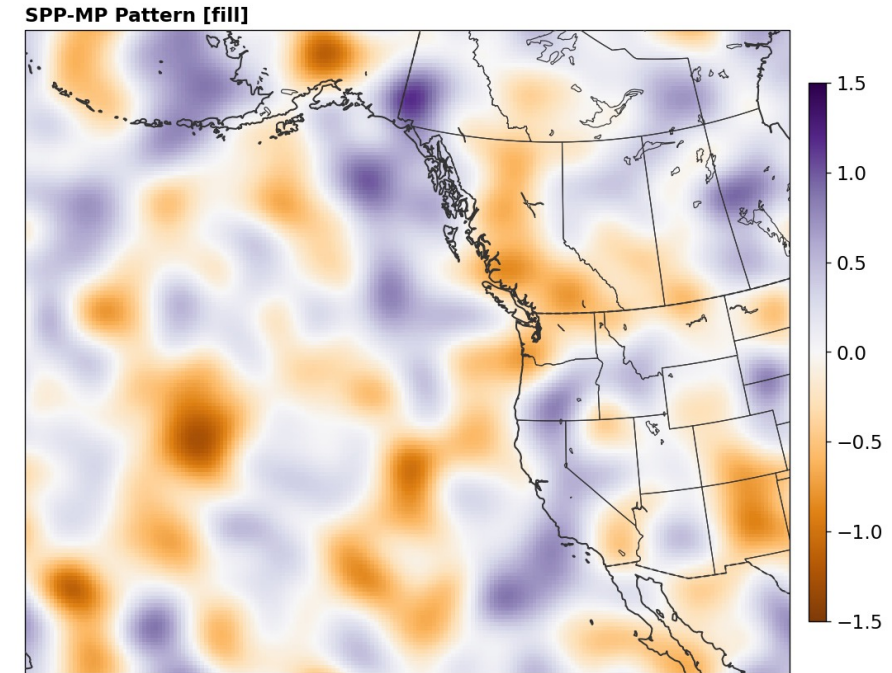


Example of SPP pattern at one forecast time for a single ensemble member



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Example of SPP pattern at one forecast time for a single ensemble member

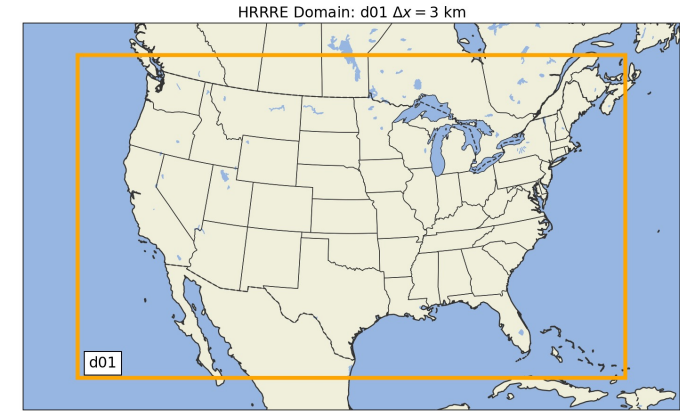
## Goals of this presentation:

- Examine precip. spread characteristics between two ensemble configurations for two representative case studies, focusing on how SPP perts. affect mesoscale precip. variations
- Quantify differences in deterministic (ens. mean) and probabilistic forecast skill for near-surface thermodynamic, precipitation, and precipitation-type metrics

# Physics uncertainty in high-res. ensembles

## *WPC-HMT: 2021-22 WWE Ensemble Configuration*

- Forecasts run by NOAA-GSL (David Dowell, Isidora Jankov, Trevor Alcott)
- WRF v3.9+
- HRRRE configuration, with only SPP active (no SPPT)
- HRRRDAS ICs, GEFS BCs
- All forecasts initialized at 12 UTC and run for 48h, 21 total cases between Dec 2021 and Mar 2022
- MYNN Level 2.5 PBL scheme and Thompson-Eidhammer aerosol-aware MP
- **During WWE, tested two ensemble configurations (9 members each)**



Abbreviation	ICs/BCs	Stochastic Physics	Decorrelation Scales	Notes
HRRRE_BASE “baseline”	HRRRDAS/GEFS members (varied)	SPP-LSM only	L = 150 km T = 72 h	
HRRRE_ALLSPP “experiment”	HRRRDAS/GEFS members (varied)	SPP-LSM, SPP-PBL, SPP-MP	L = 150 km T = 72 h	SPP-PBL includes PBL, SL, diffusion perts.; SPP-MP includes both existing and new perts.

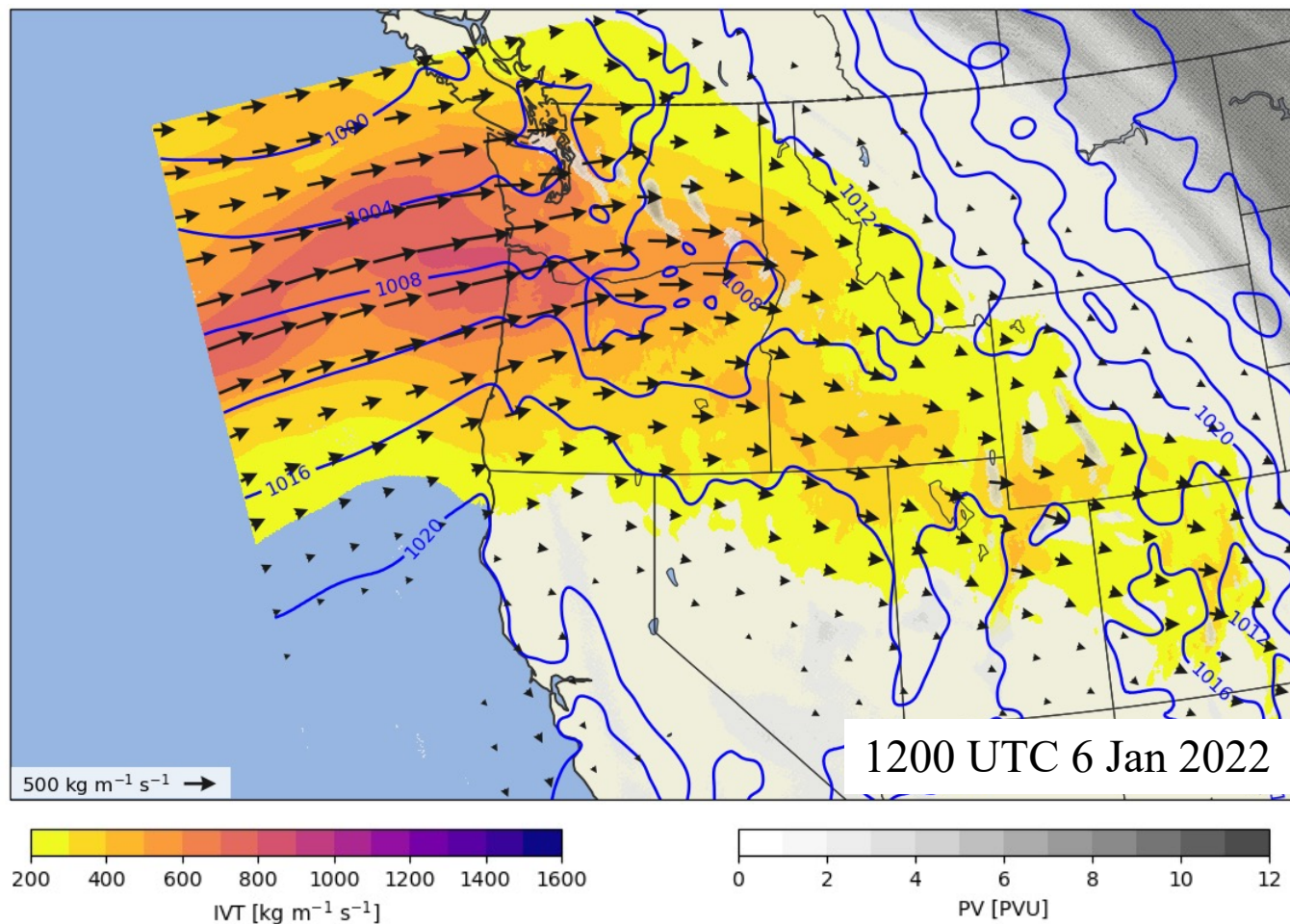


# 5-7 January 2022

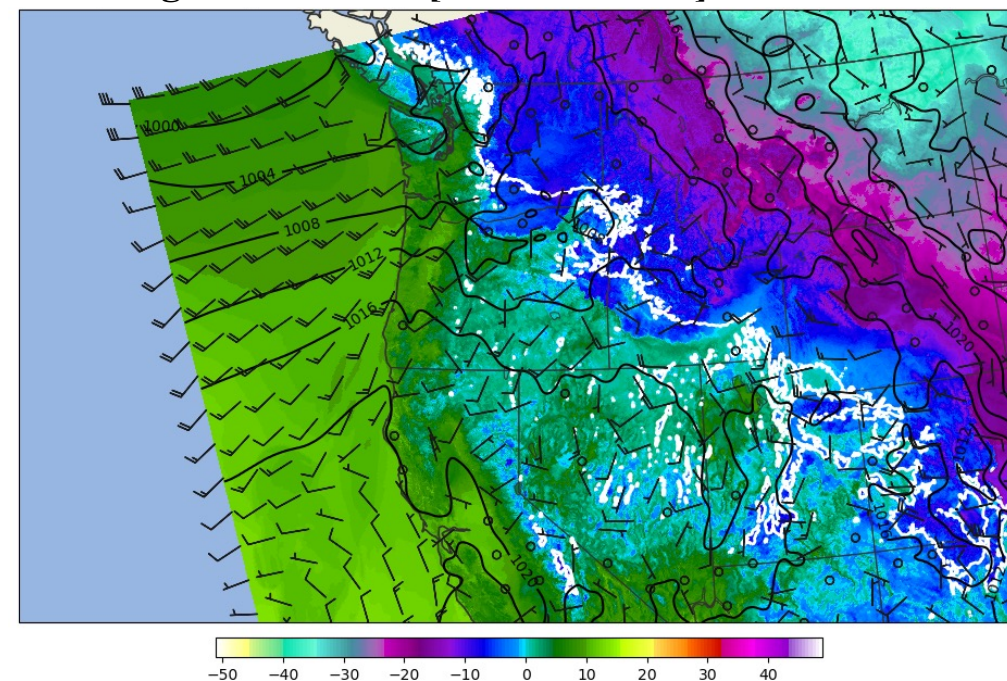
Pacific NW atmospheric river event, heavy coastal rain and flooding in Washington and Oregon,  
heavy snow east of the Cascades crest

# Synoptic Overview

MSLP [contours, hPa], 250-hPa PV [fill, PVU],  
1000-100 hPa IVT [fill/vectors,  $\text{kg m}^{-1} \text{s}^{-1}$ ]



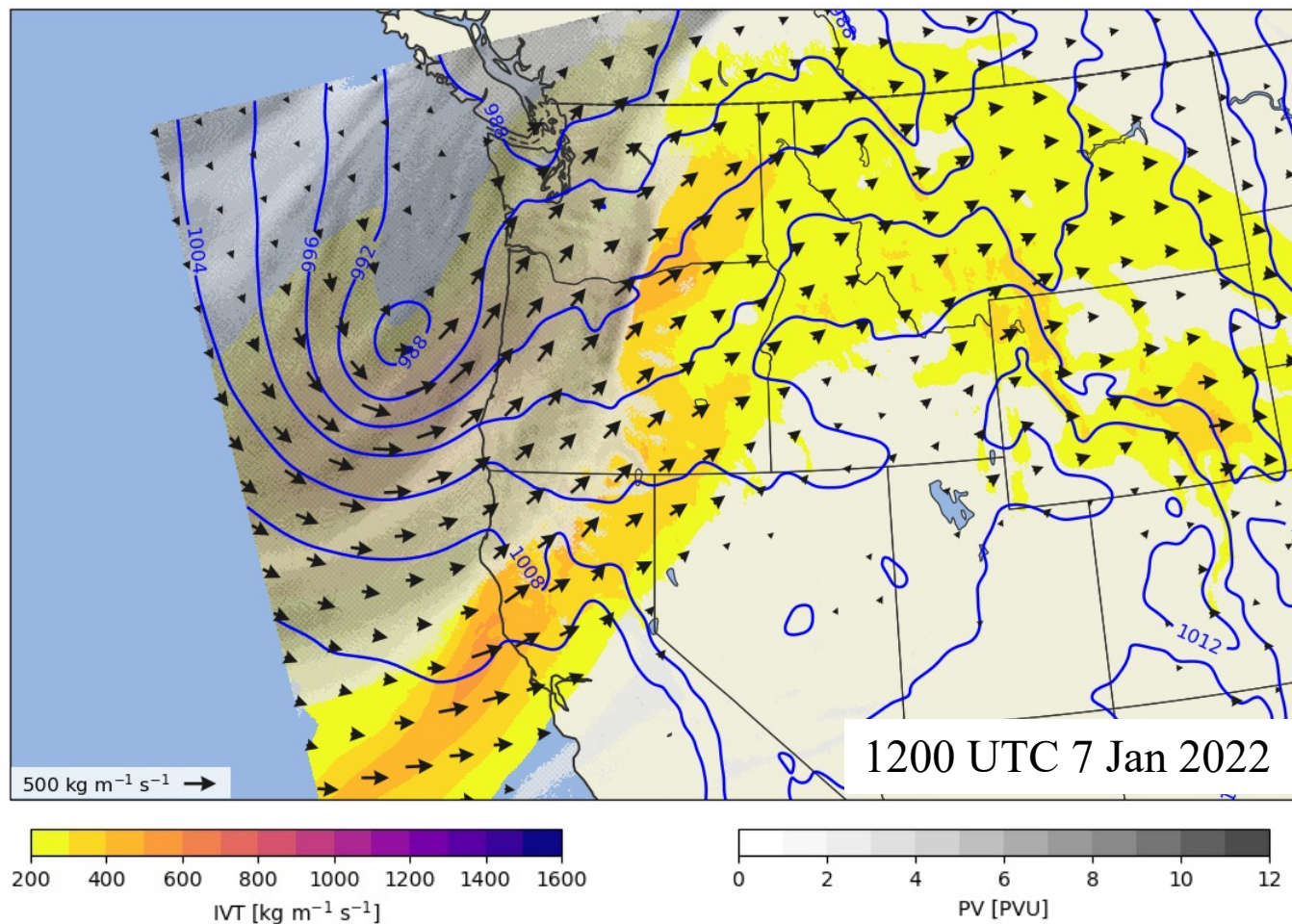
MSLP [contours, hPa], 10-m Wind [barbs, kt],  
2-m Temperature [fill,  $^{\circ}\text{C}$ ],  
Freezing Level at Sfc. [white contour]



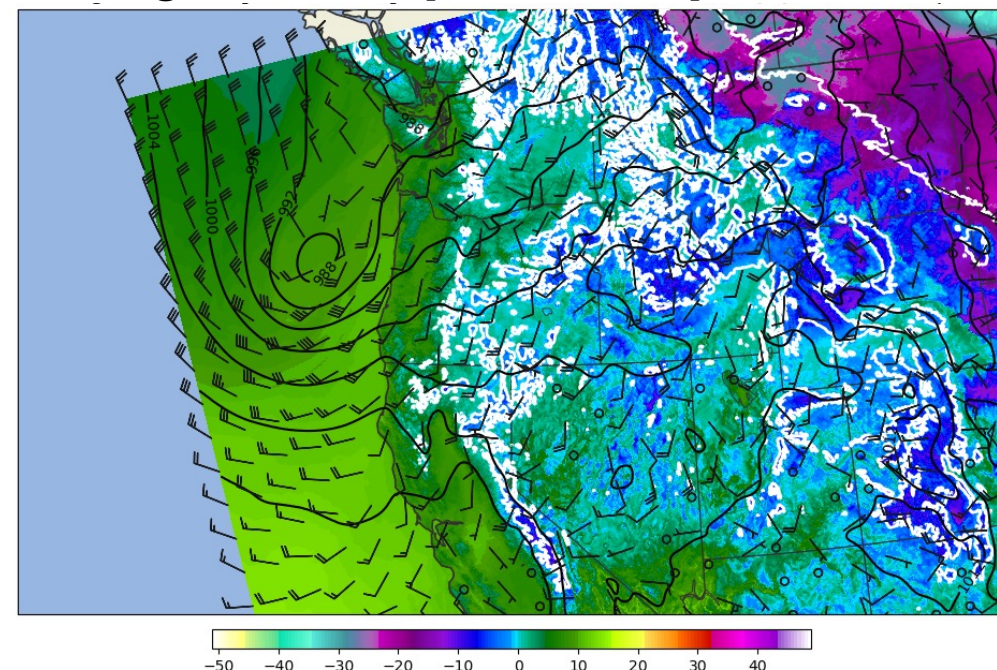


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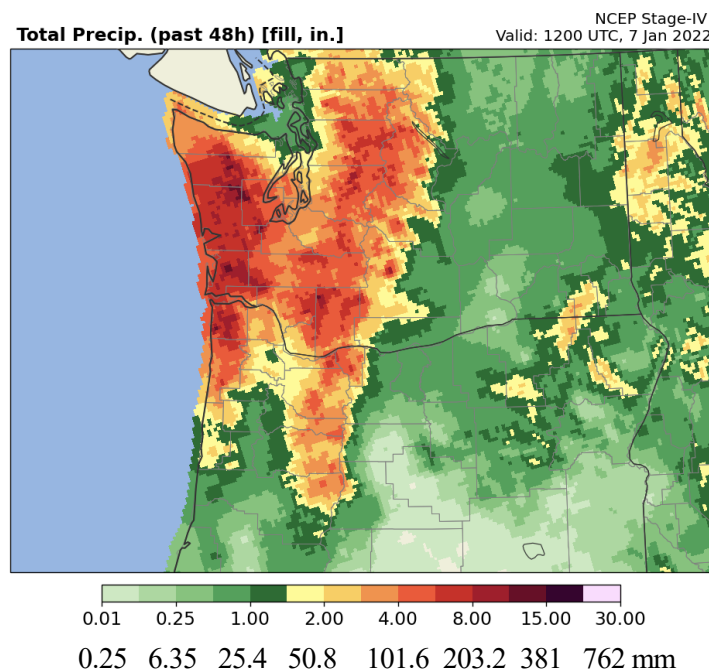


MSLP [contours, hPa], 10-m Wind [barbs, kt],  
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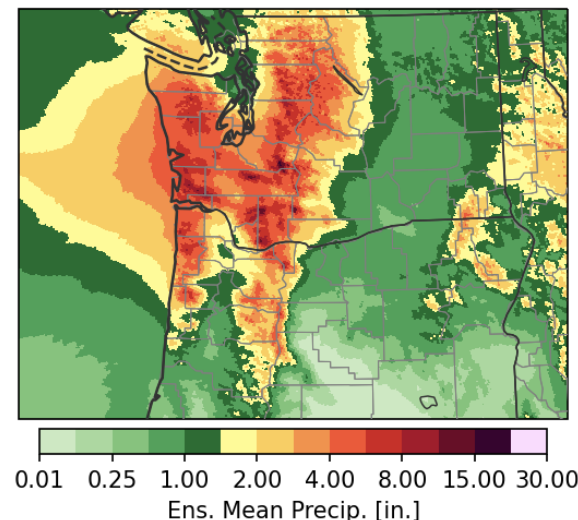


# 12z 5 Jan – 12z 7 Jan 2022

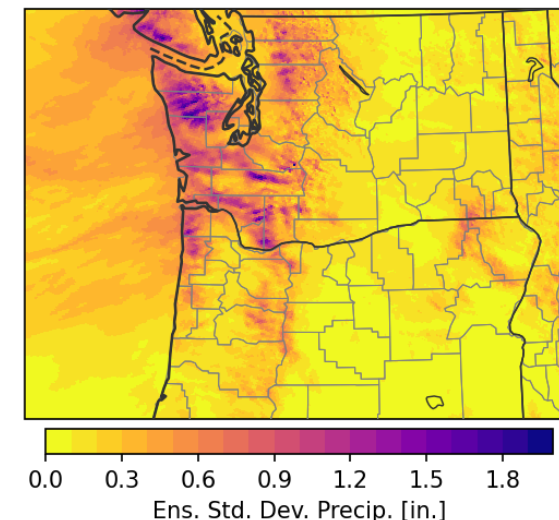
## Stage IV



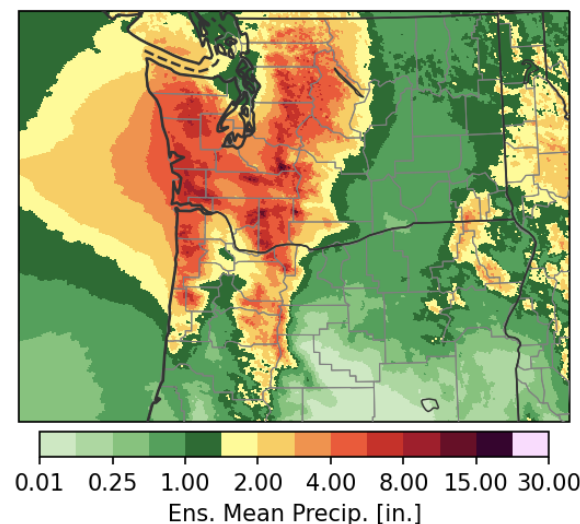
**Total Precip. [fill, in.]**



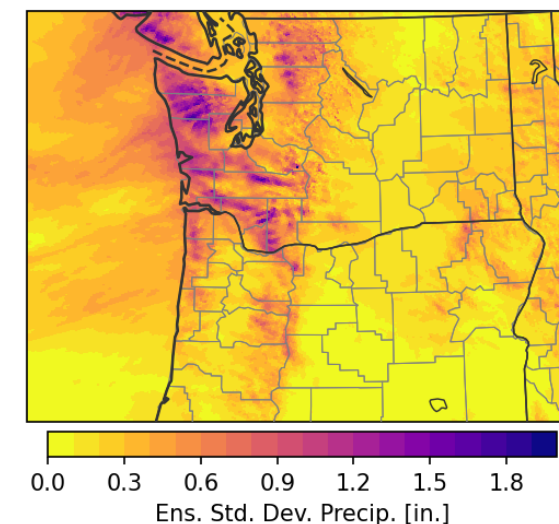
**HRRRE\_BASE** ), Init: 1200 UTC, 5 Jan 2022  
Valid: 1200 UTC, 7 Jan 2022



**Total Precip. [fill, in.]**



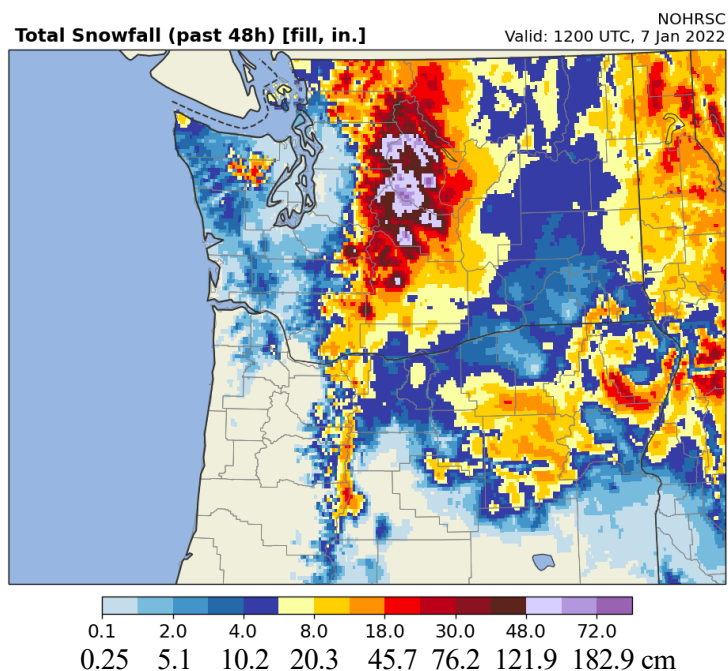
**HRRRE\_ALLSPP** ), Init: 1200 UTC, 5 Jan 2022  
Valid: 1200 UTC, 7 Jan 2022



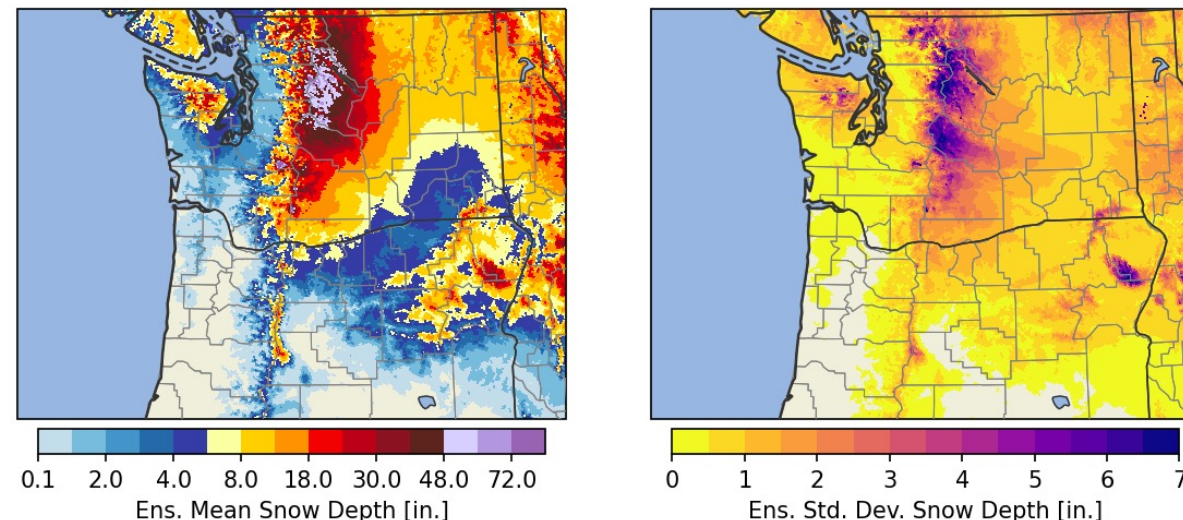


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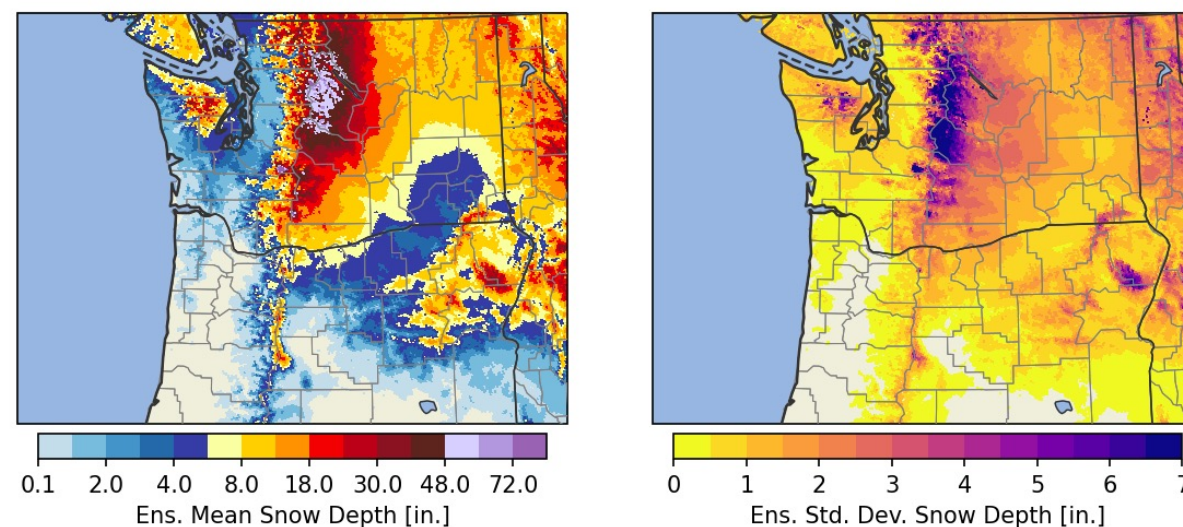
NOHRSC



**Total Acc. Snow Depth [fill, in.]** HRRRE\_BASE  
, Init: 1200 UTC, 5 Jan 2022  
Valid: 1200 UTC, 7 Jan 2022

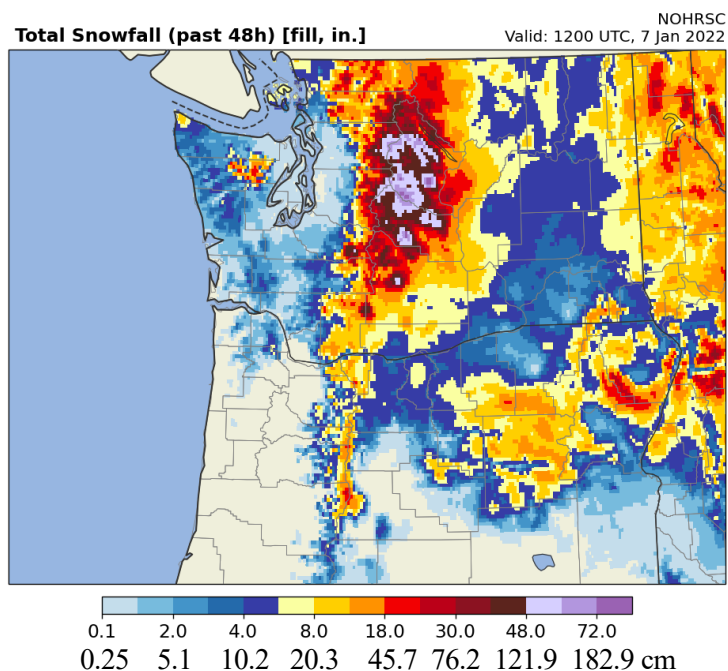


**Total Acc. Snow Depth [fill, in.]** HRRRE\_ALLSPP  
, Init: 1200 UTC, 5 Jan 2022  
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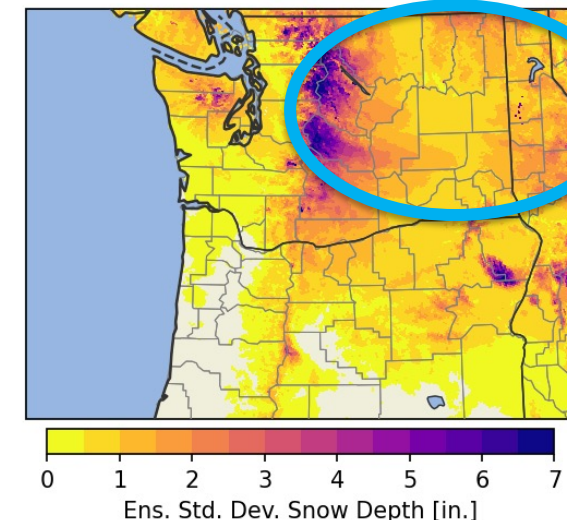
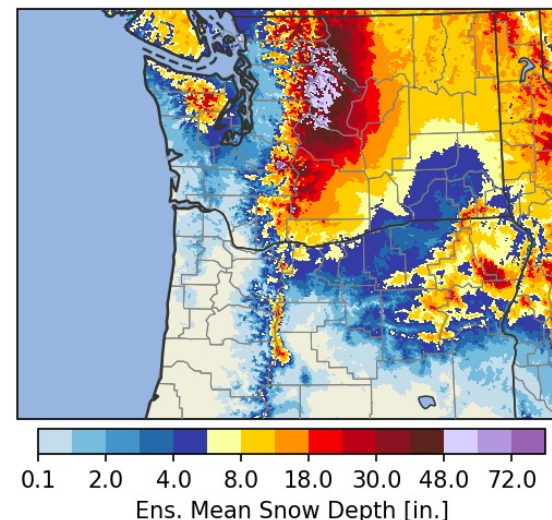


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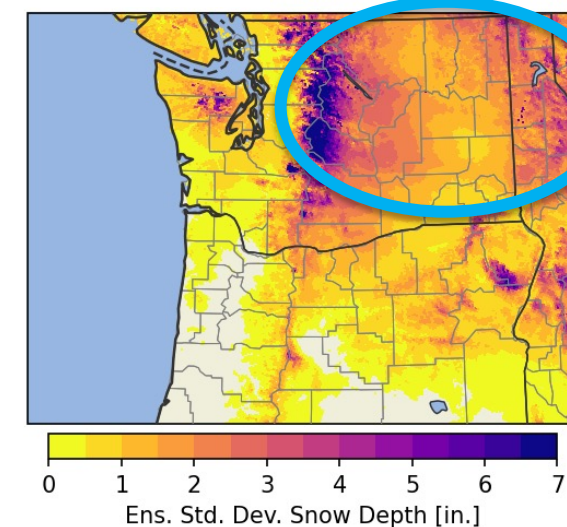
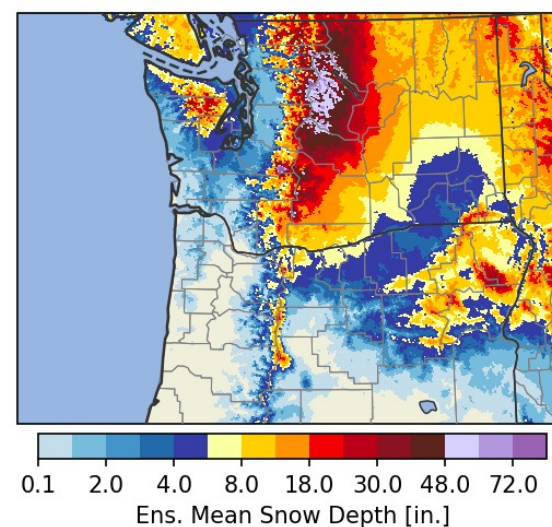
## NOHRSC



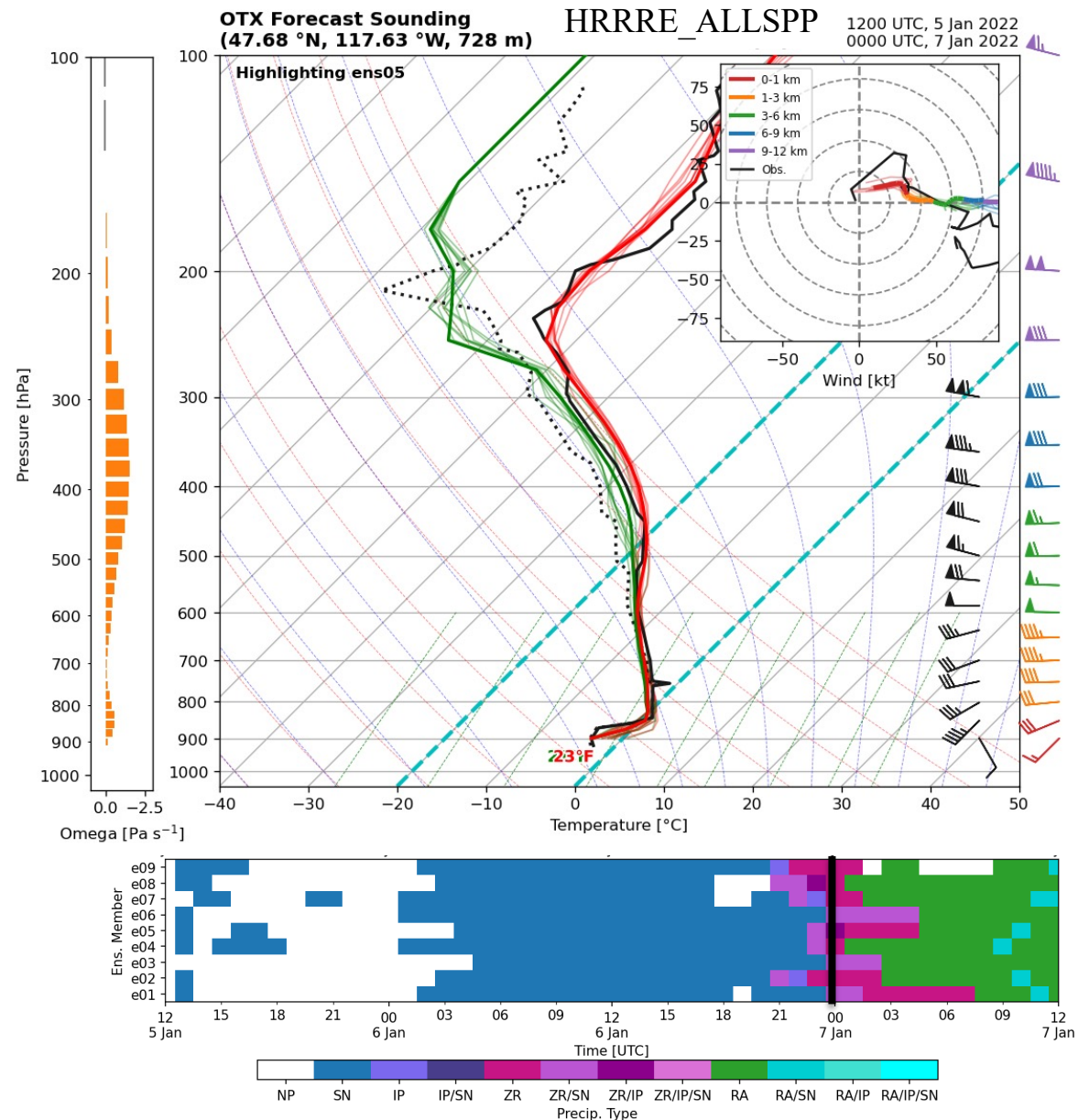
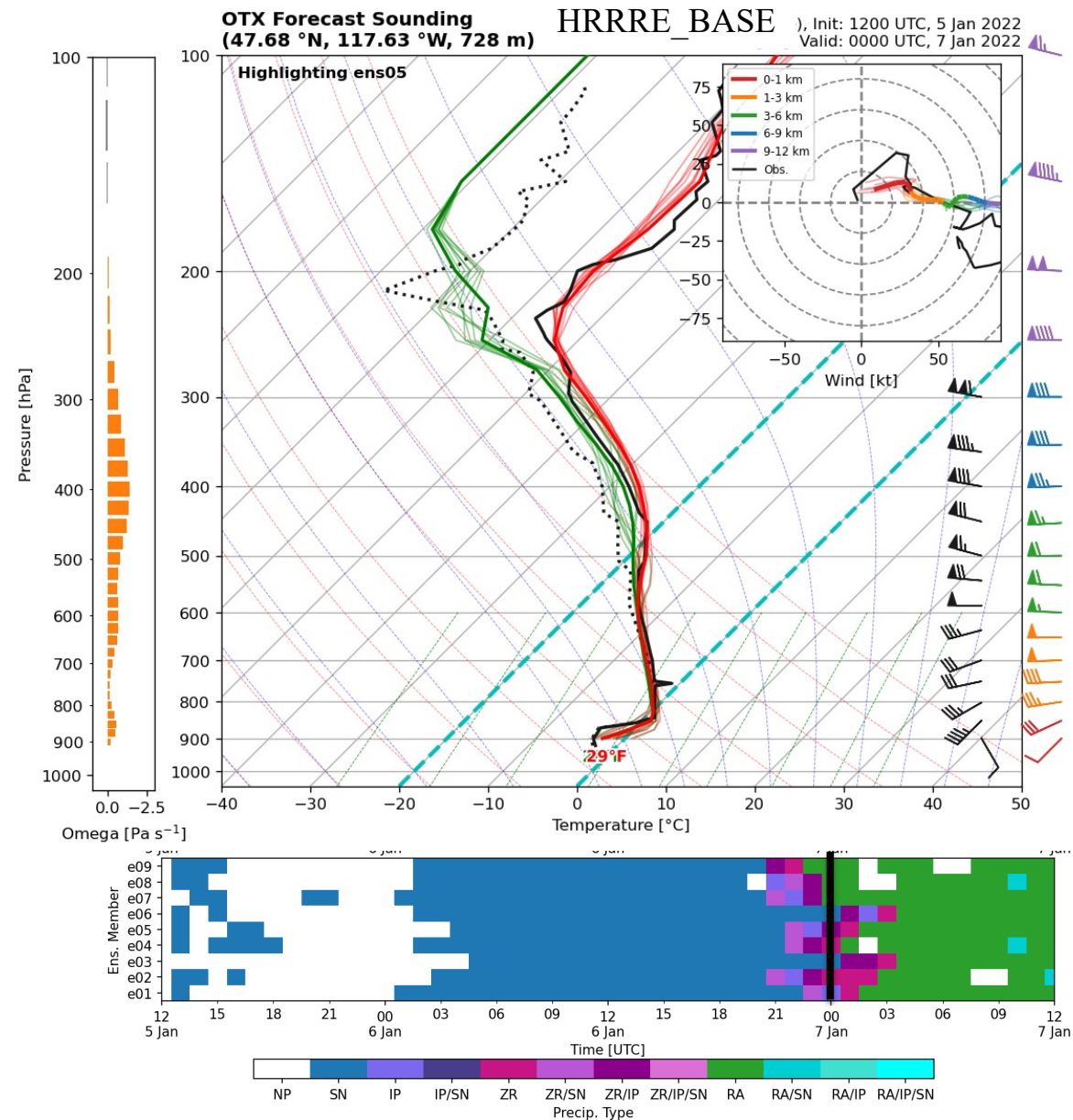
**Total Acc. Snow Depth [fill, in.]** HRRRE\_BASE  
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**Total Acc. Snow Depth [fill, in.]** HRRRE\_ALLSPP  
, Init: 1200 UTC, 5 Jan 2022  
Valid: 1200 UTC, 7 Jan 2022









Kingston, NY (photo credit: [Albany Times-Union](#))

Top Areas by Outages	
Tennessee	131,074
Ohio	85,752
New York	39,584
Pennsylvania	33,156
West Virginia	29,910
Last Updated	
2/4/2022, 08:08:00 AM	
Site v0.9.4	

Archived snapshot of  
poweroutage.us tracker  
from 4 February

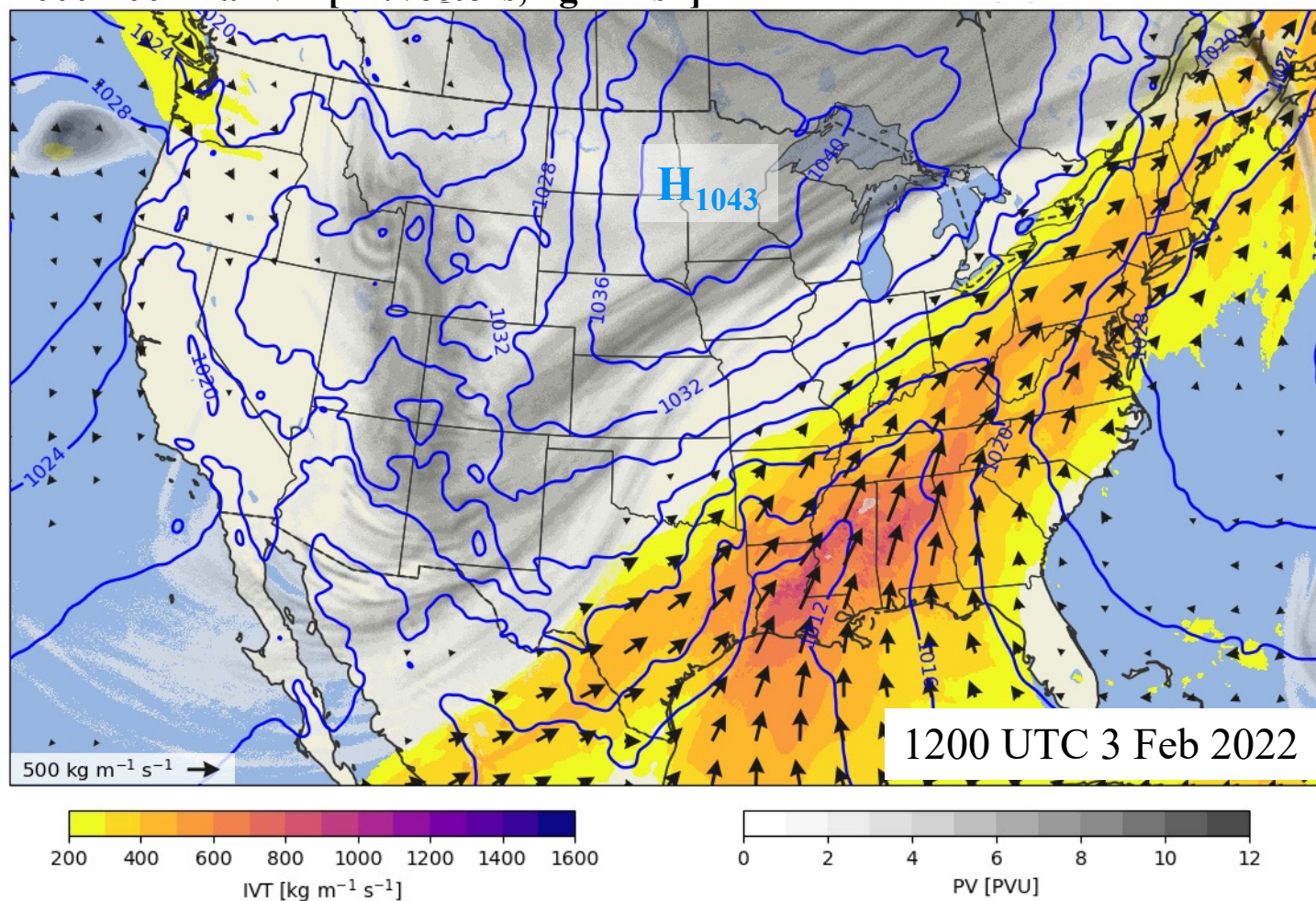
## 3–4 February 2022

Many travel and power outage-related impacts across the US, from TX to the Northeast  
(e.g., significant  $>0.25''$  ice accretion in Mid-Hudson Valley south of Albany)

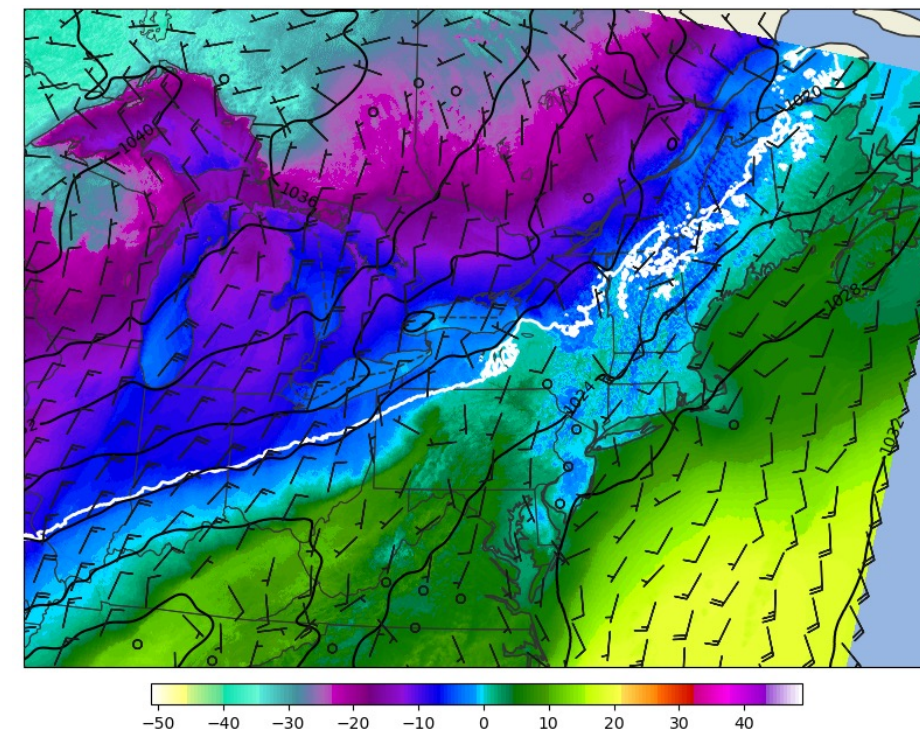


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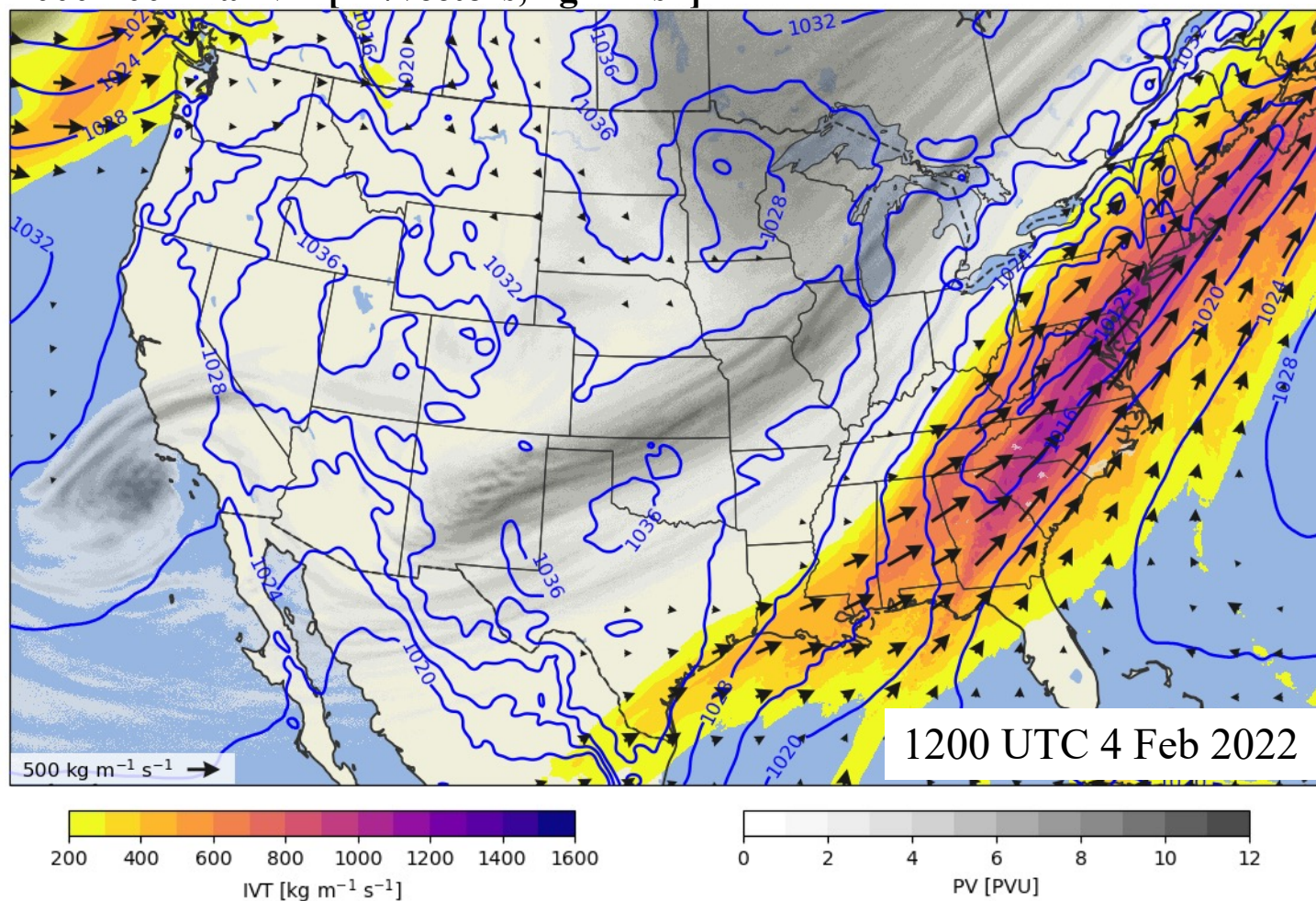
MSLP [contours, hPa], 10-m Wind [barbs, kt],  
2-m Temperature [fill,  $^{\circ}\text{C}$ ],  
Freezing Level at Sfc. [white contour]



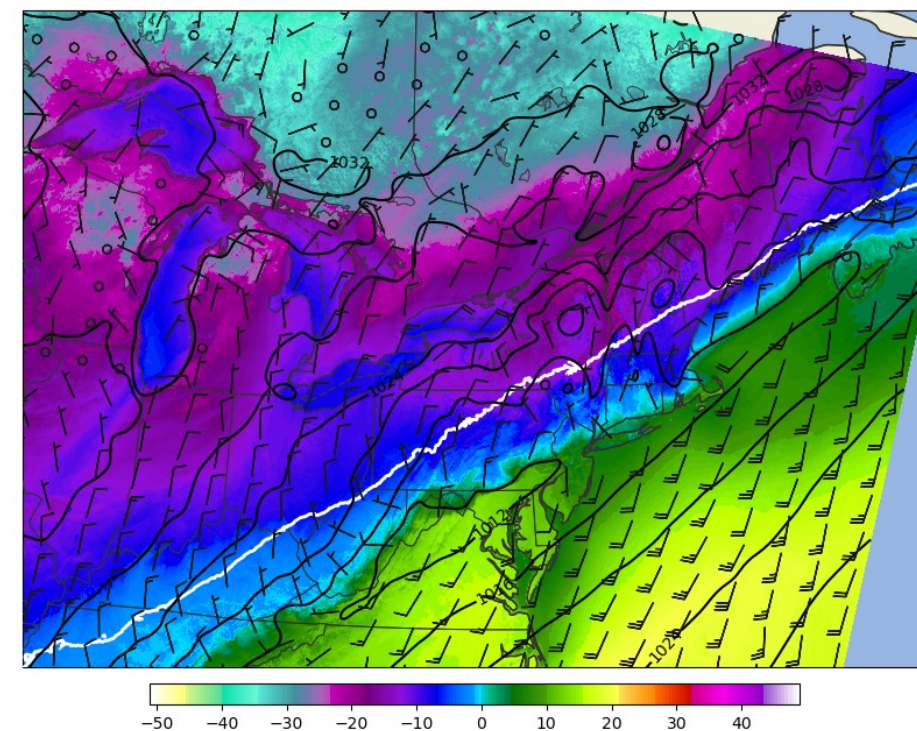


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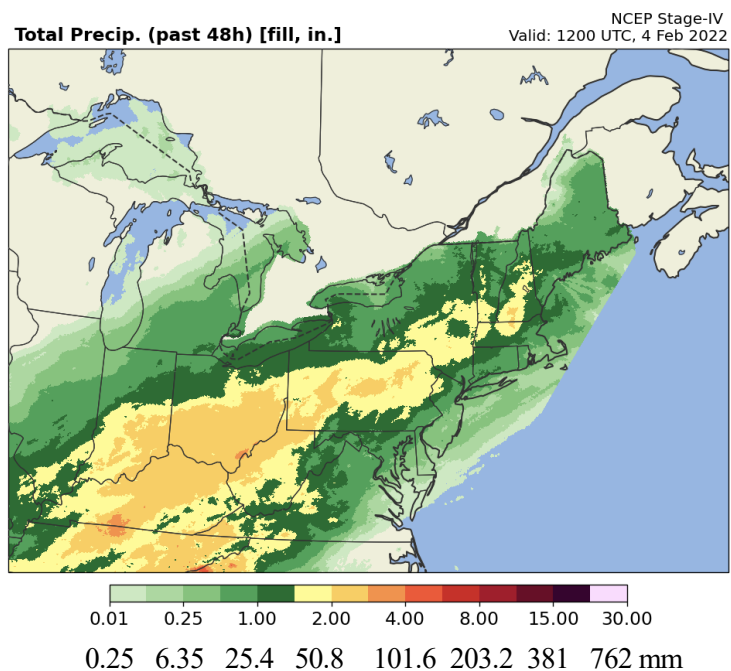
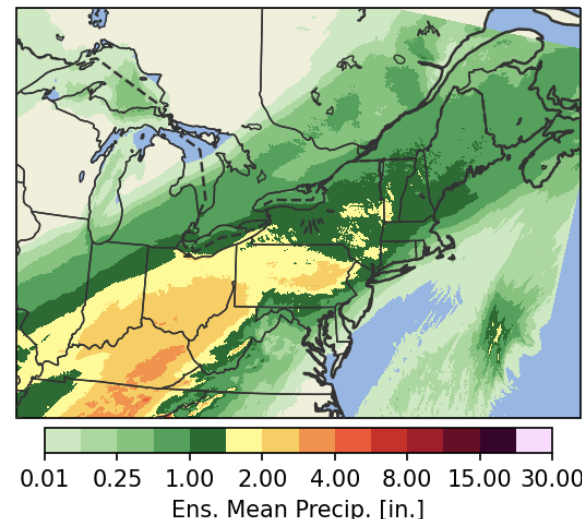
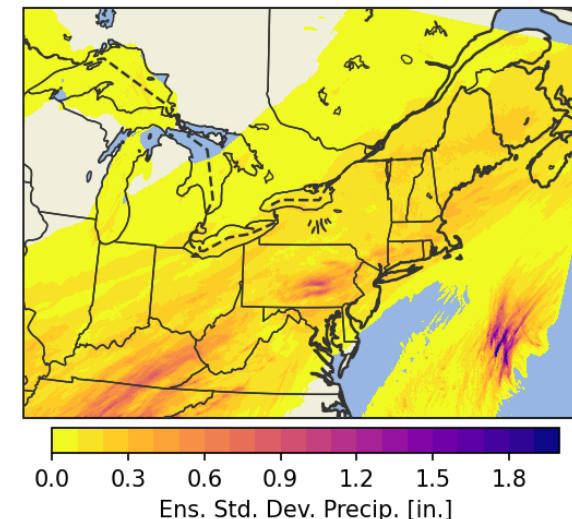
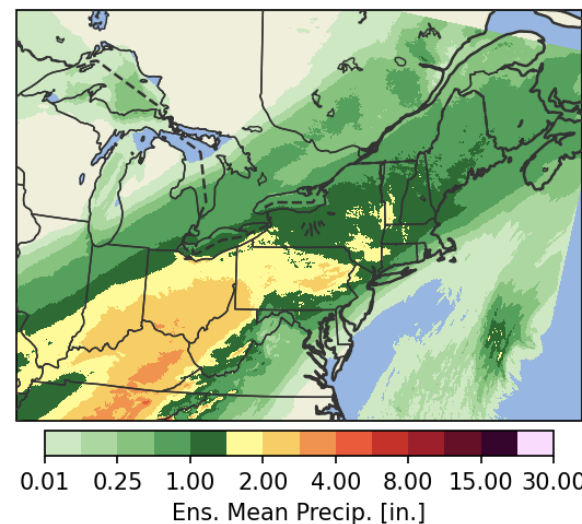
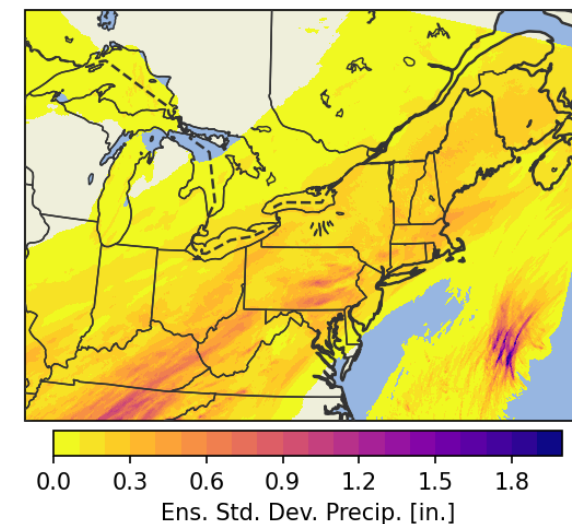
MSLP [contours, hPa], 10-m Wind [barbs, kt],  
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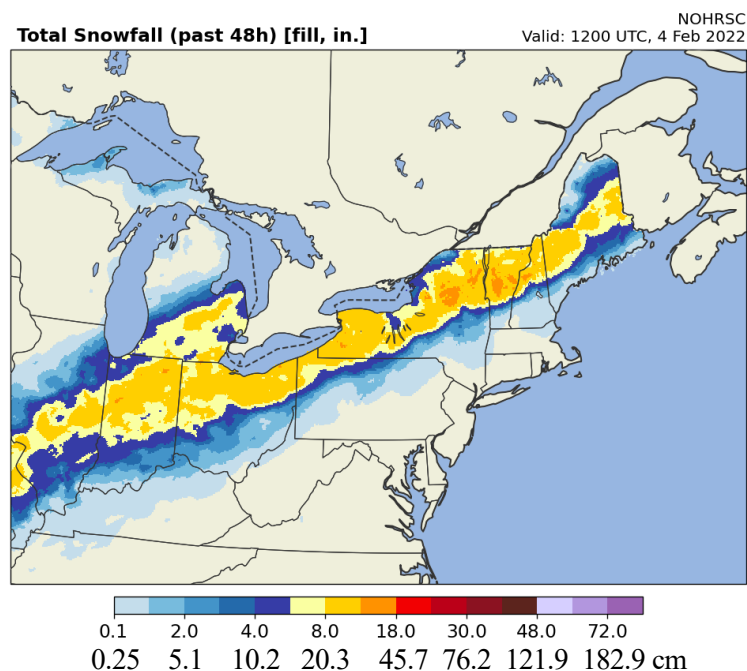
# 12z 2 Feb – 12z 4 Feb 2022

## Stage IV

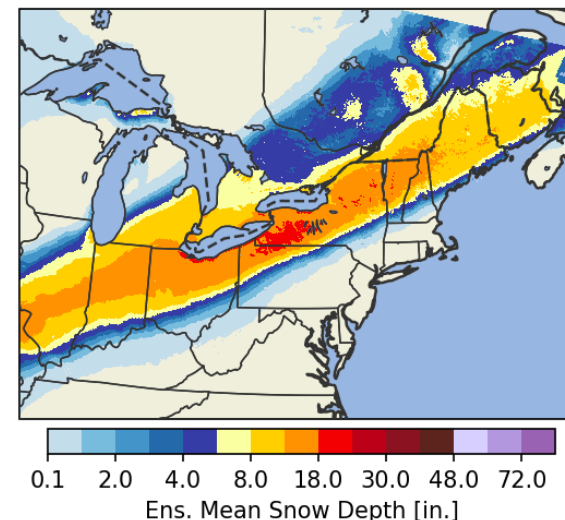
**Total Precip. [fill, in.]****HRRRE\_BASE** ), Init: 1200 UTC, 2 Feb 2022  
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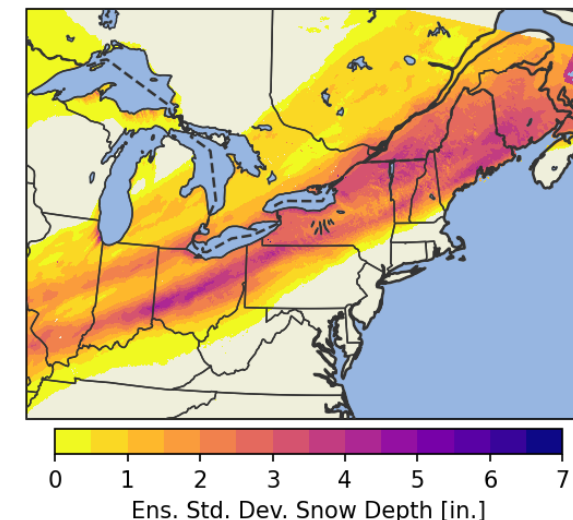
NOHRSC



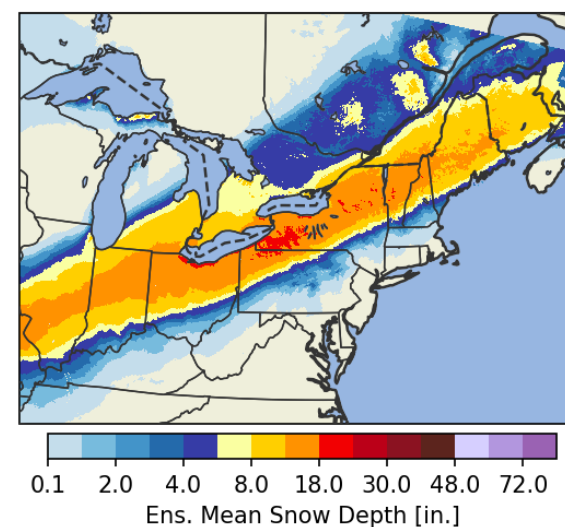
**Total Acc. Snow Depth [fill, in.]**



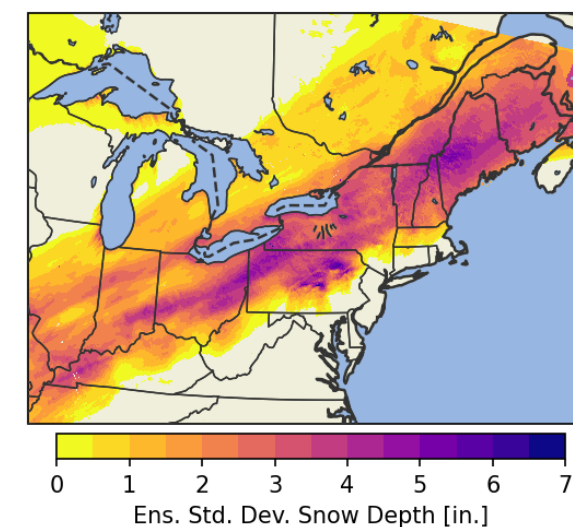
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**Total Acc. Snow Depth [fill, in.]**



**HRRRE\_ALLSPP** , Init: 1200 UTC, 2 Feb 2022  
Valid: 1200 UTC, 4 Feb 2022

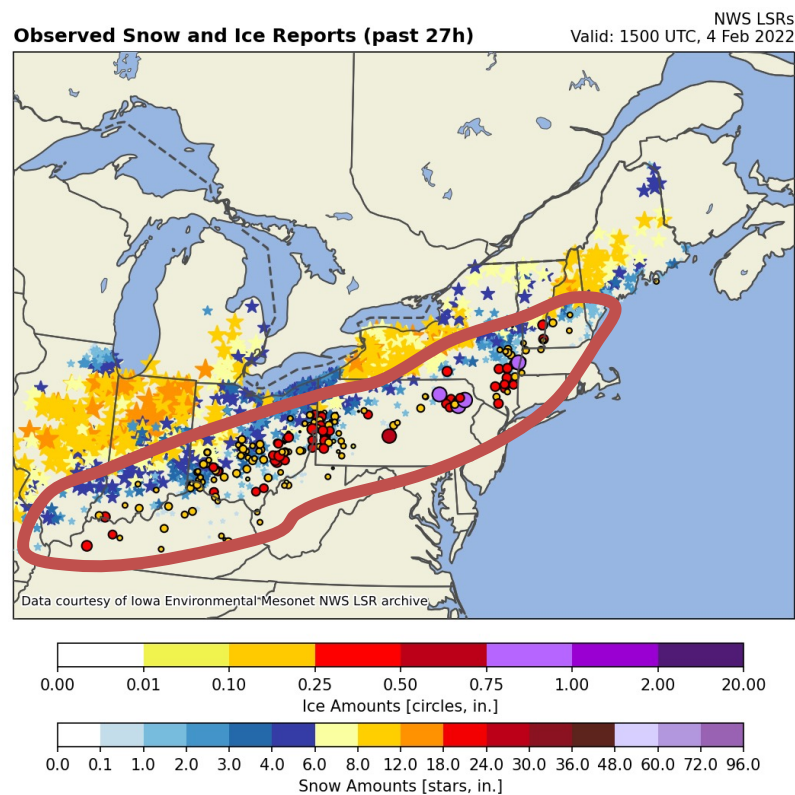




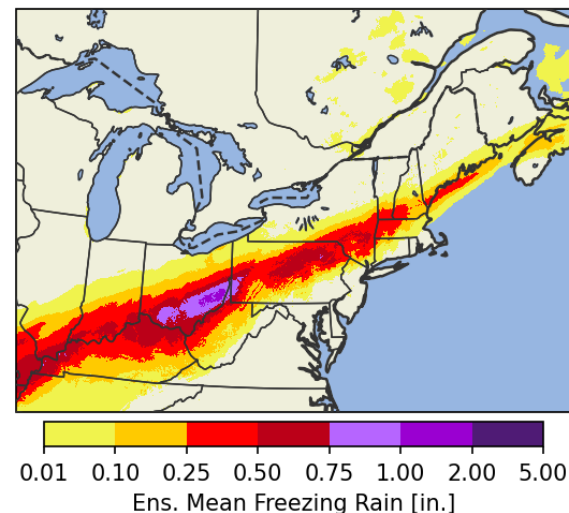
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FRAM method ([Sanders and Barjenbruch 2016](#))

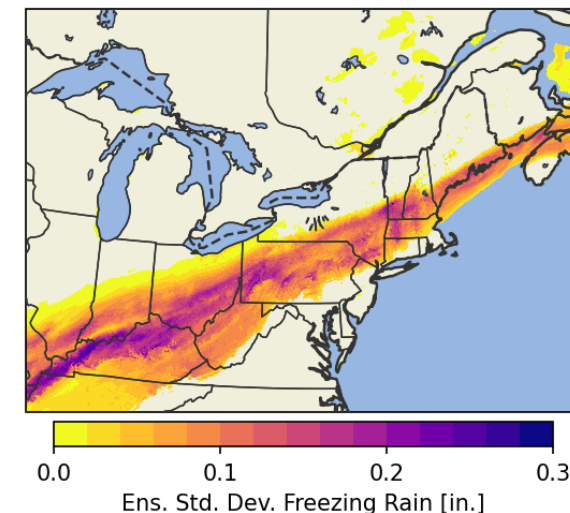
## NWS LSRs



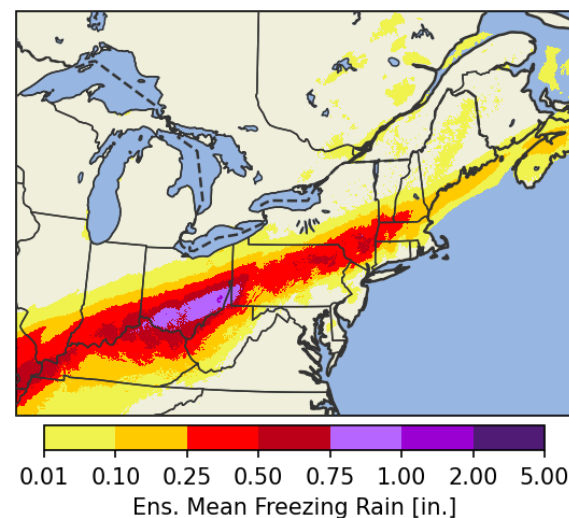
**Total Freezing Rain  
FRAM Estimate [fill, in.]**



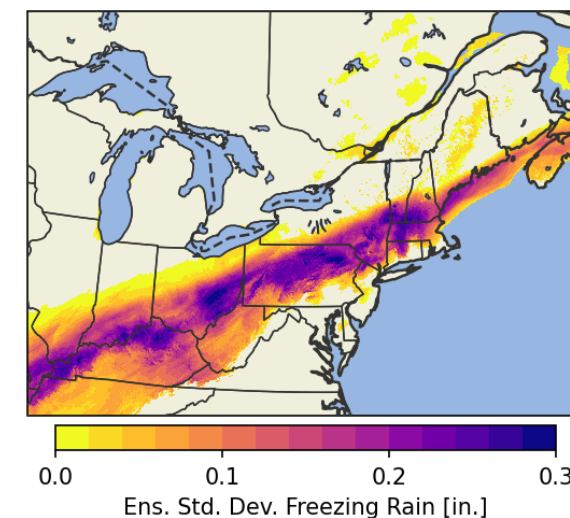
**HRRRE\_BASE** ), Init: 1200 UTC, 2 Feb 2022  
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**Total Freezing Rain  
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**HRRRE\_ALLSPP** ), Init: 1200 UTC, 2 Feb 2022  
Valid: 1200 UTC, 4 Feb 2022

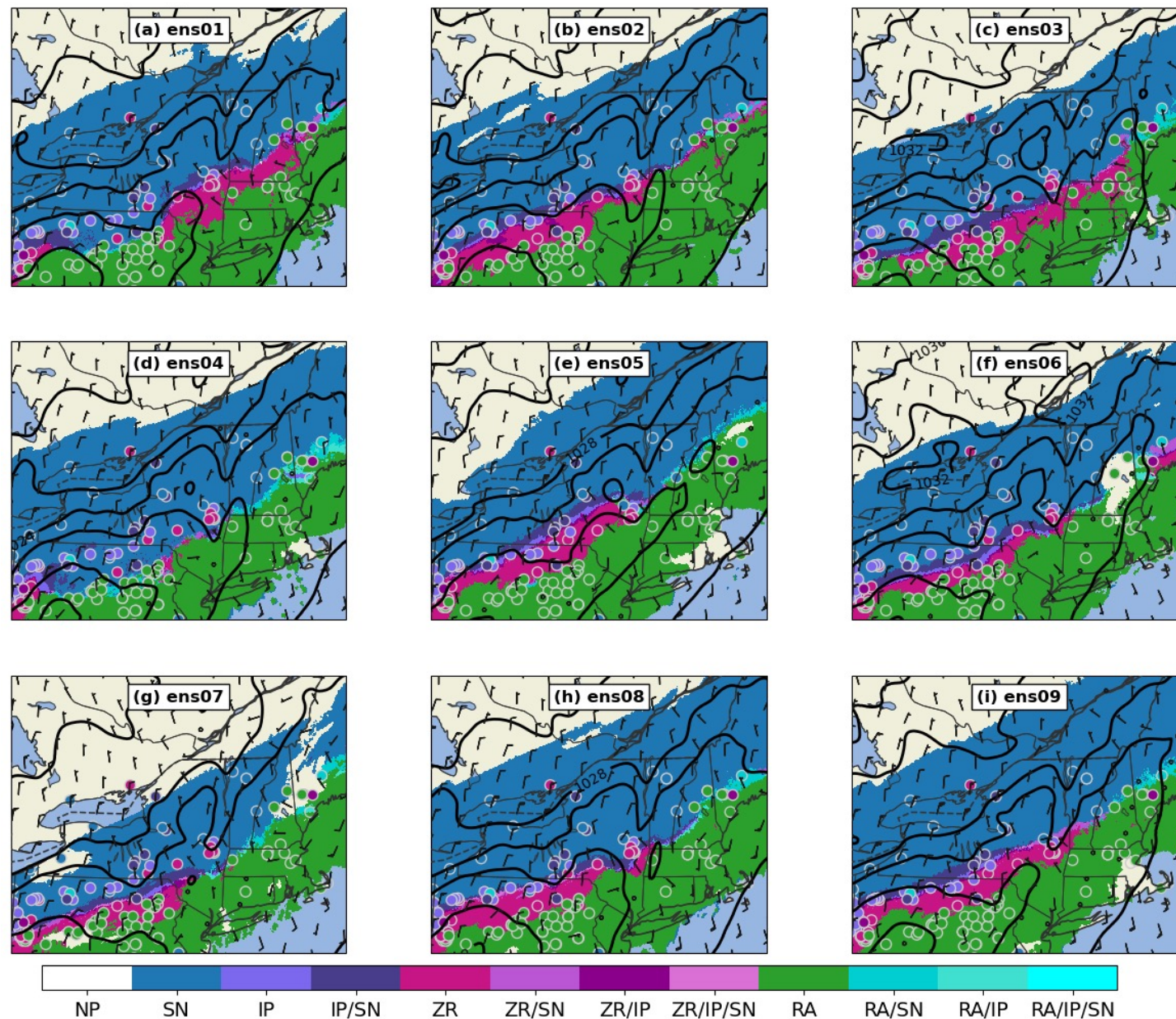


# P-Type Spread

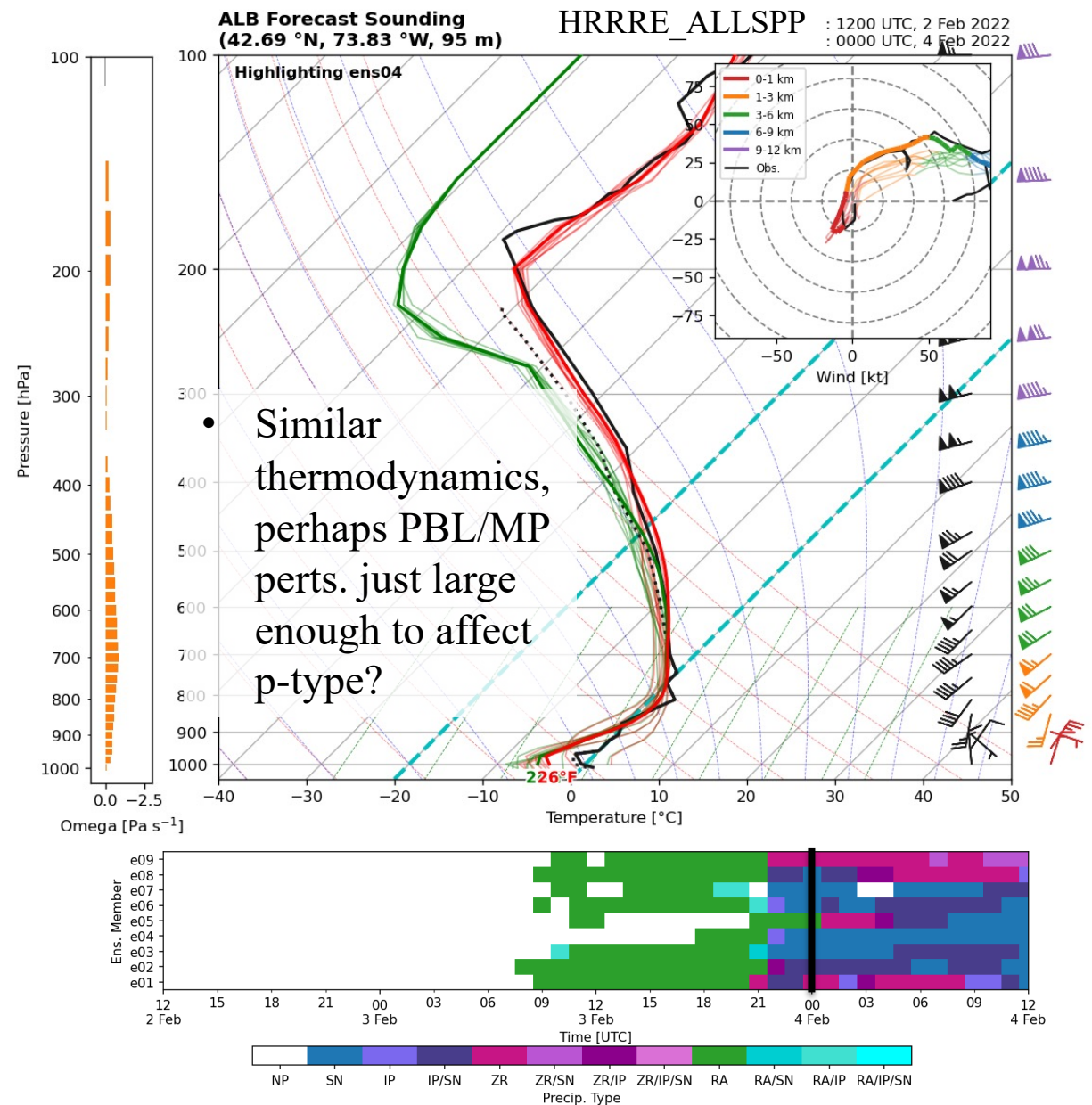
HRRRE\_ALLSPP

Valid: 0000 UTC 4 Feb 2022

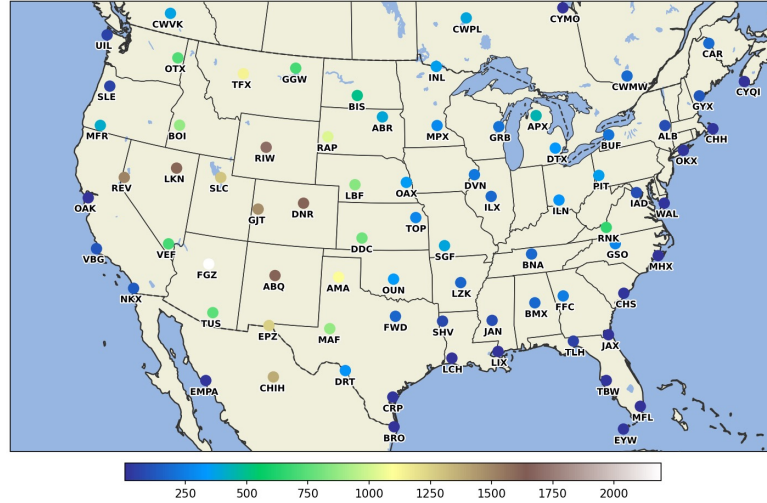
mPING reports (circles): 1-h window  
ending at forecast valid time



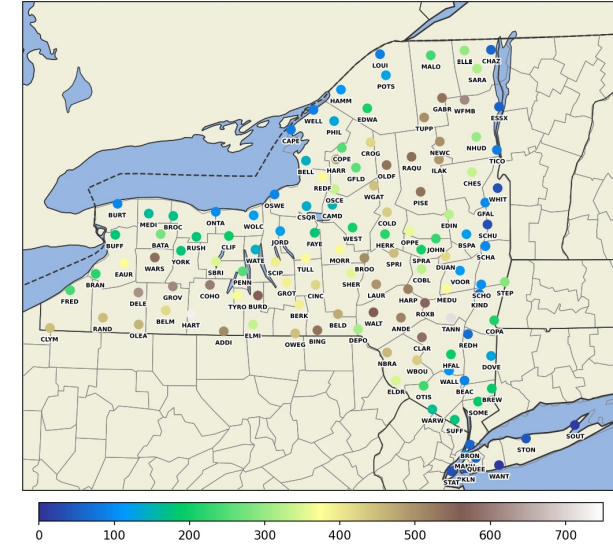




Upper Air Observation Site Elevations [m]



NYSM Standard Site Elevations [m]

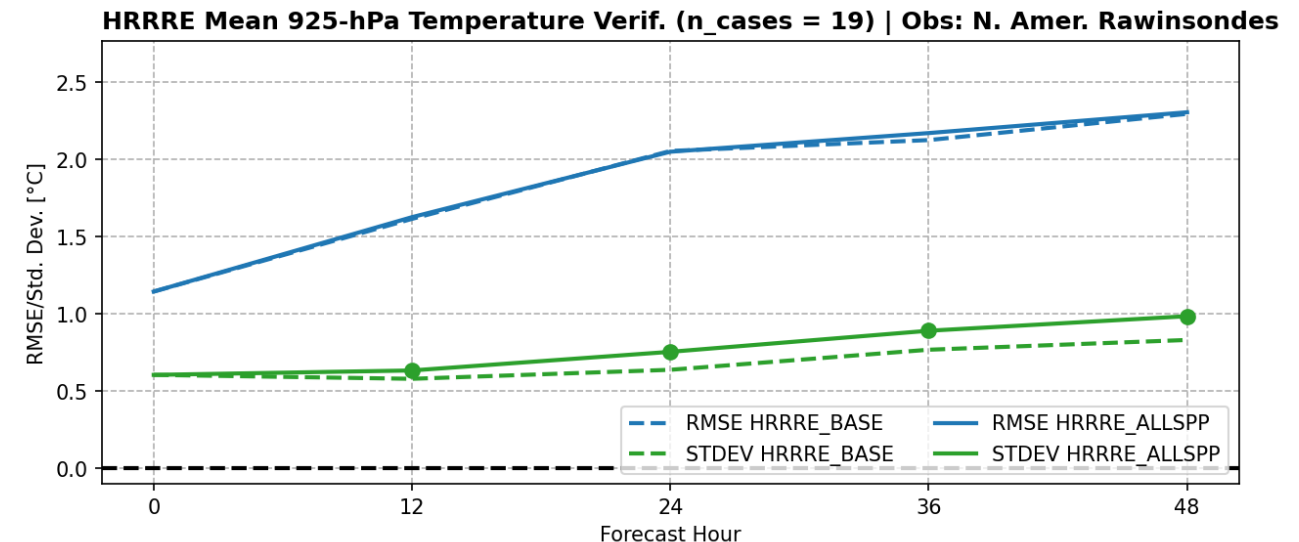
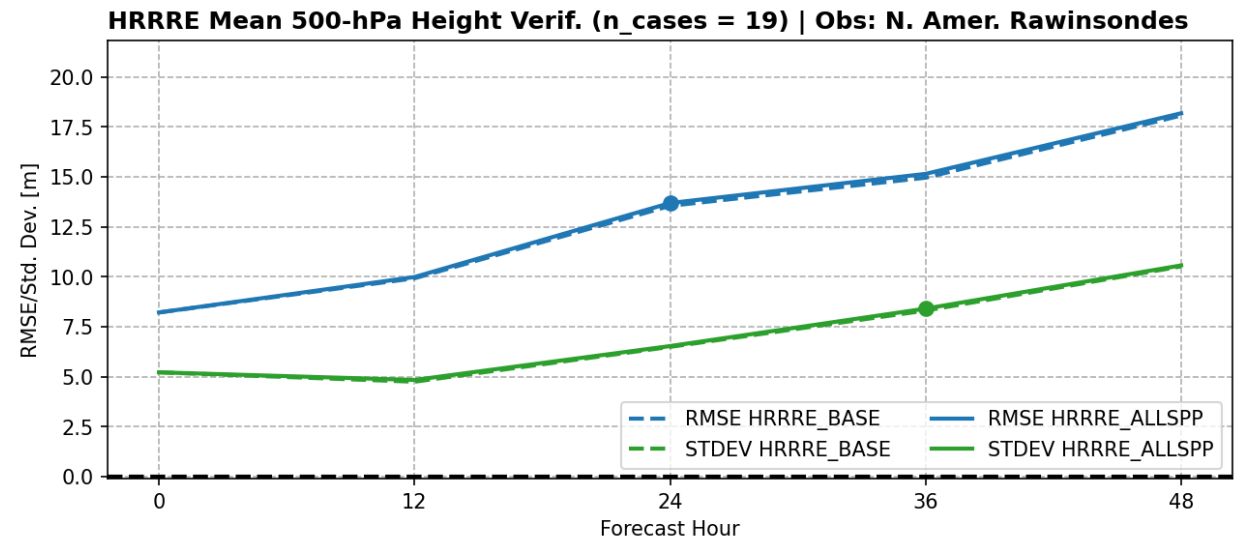
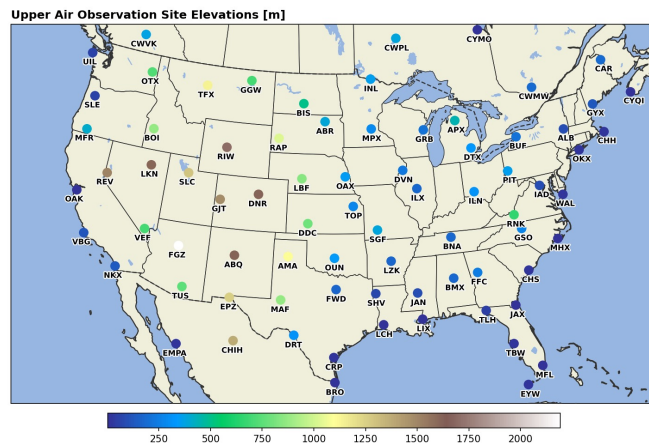


# Thermodynamic Verification



# Upper-Air Verification

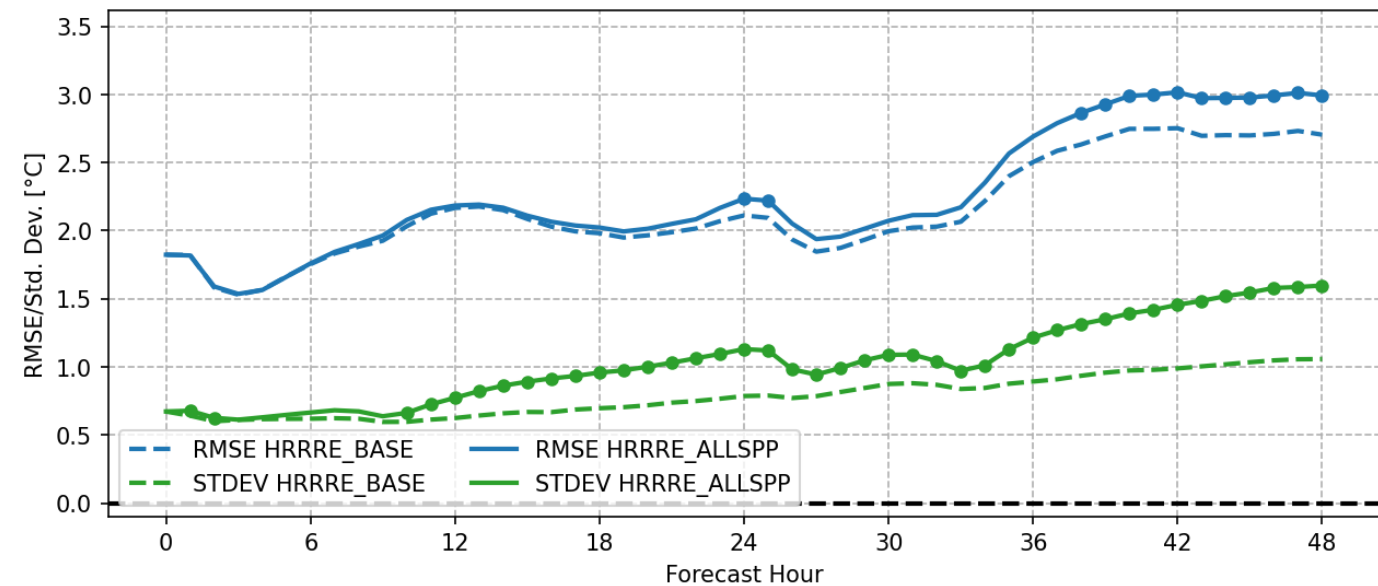
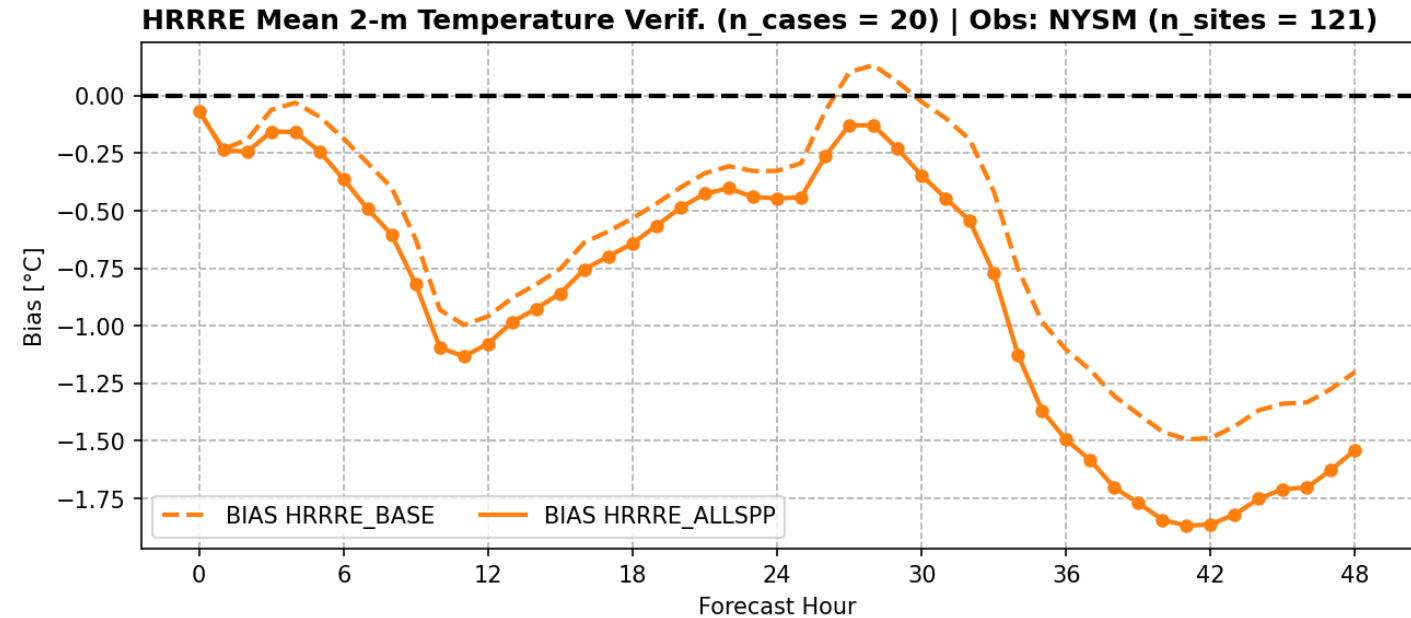
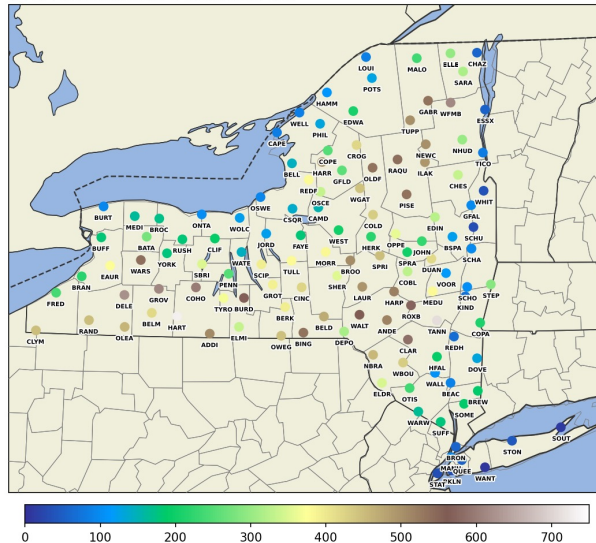
- Verifying ens. mean against rawinsonde observations
- At upper levels (<700 hPa), ensemble verification nearly identical
- At lower levels (>850 hPa), SPP adds modest amount of temperature spread (perhaps increased variability in PBL mixing)



# Near-Surface Verification

- Verifying ens. mean against NYS Mesonet observations
- Diurnal variations in ens. mean bias, larger cool bias at night
- Including SPP increases spread but also RMSE and bias

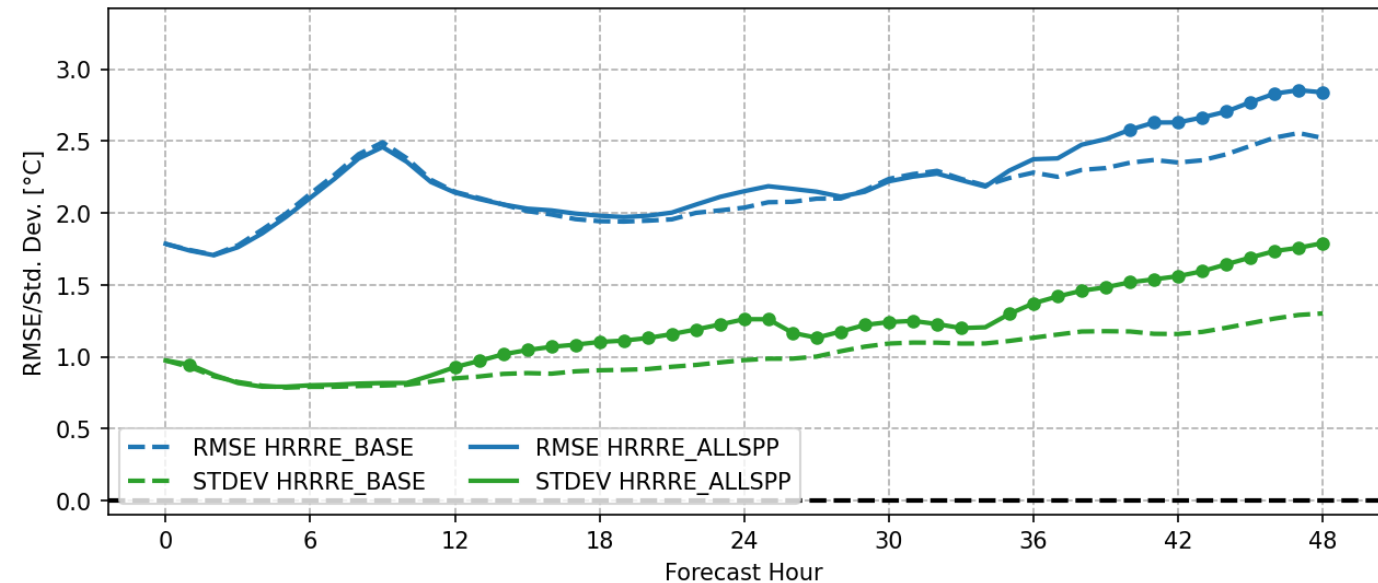
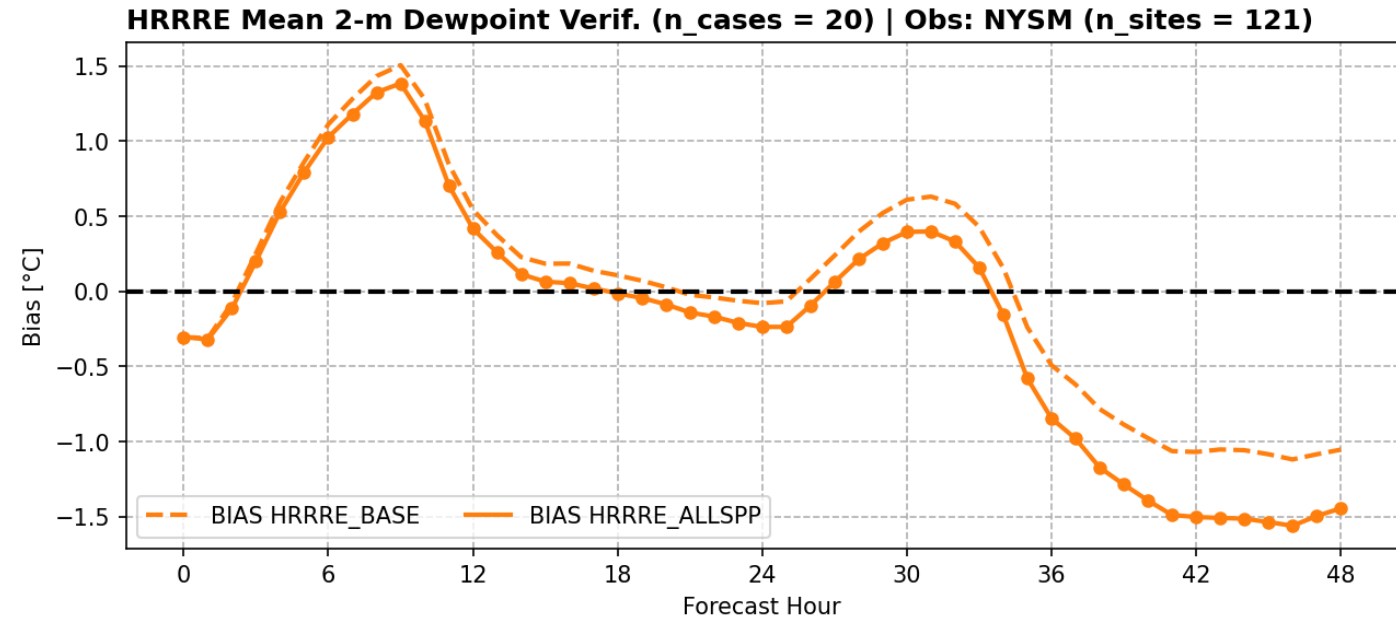
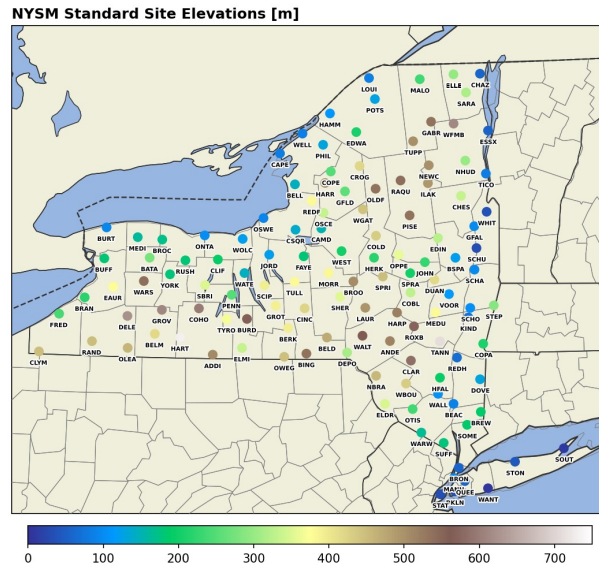
NYSM Standard Site Elevations [m]

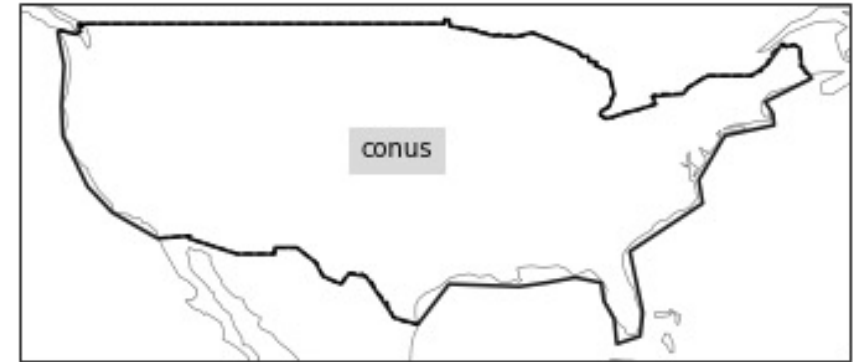




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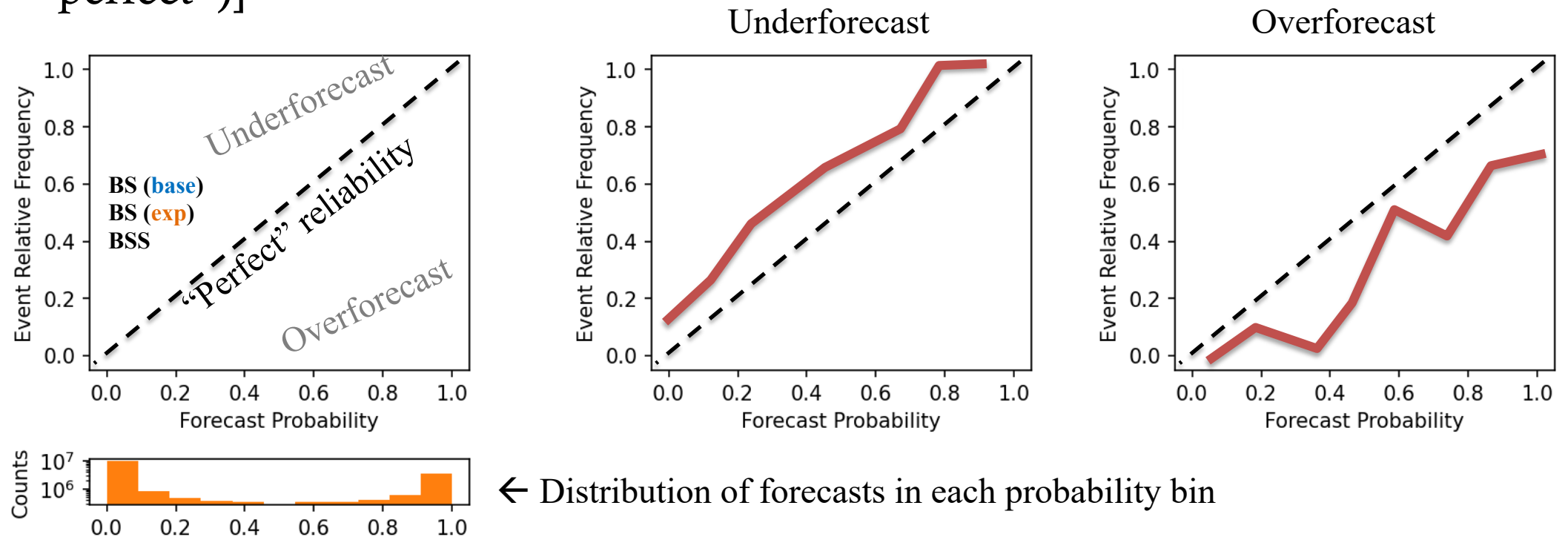


# Precip., Snowfall, and P-Type Verification



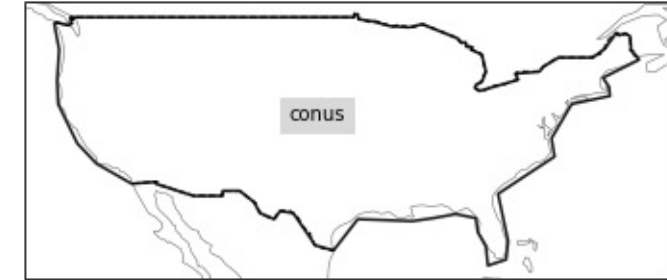
# Reliability Diagrams 101

- Assessing ensemble forecast probabilities (precip. > threshold, in this case)
- Quantifying each ensemble's reliability using Brier Score [BS, (lower = better, 0 = "perfect")]

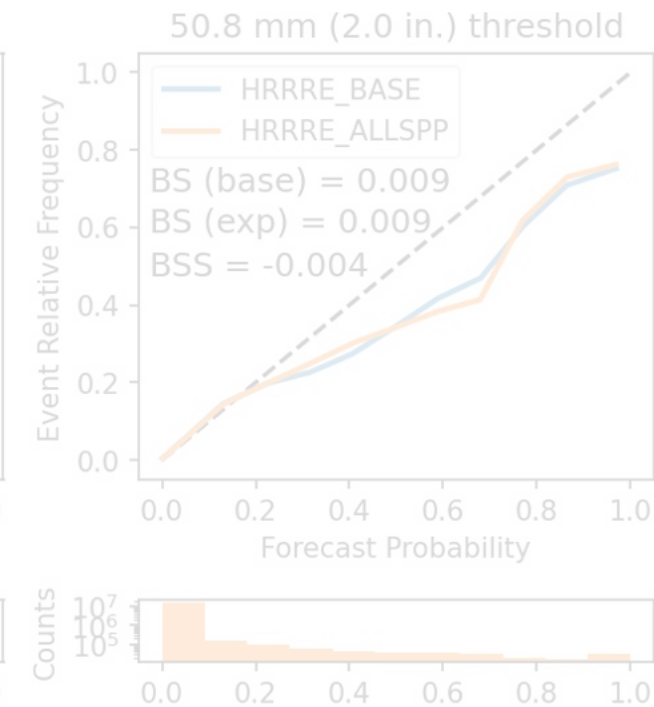
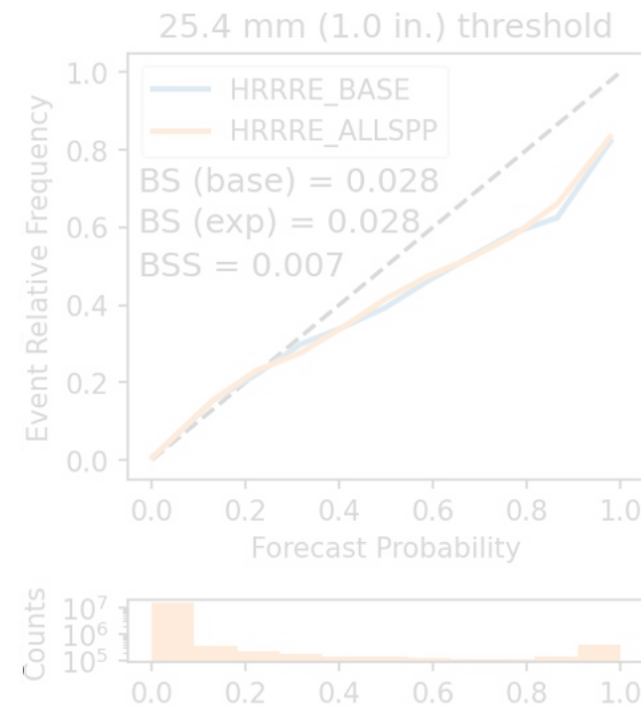
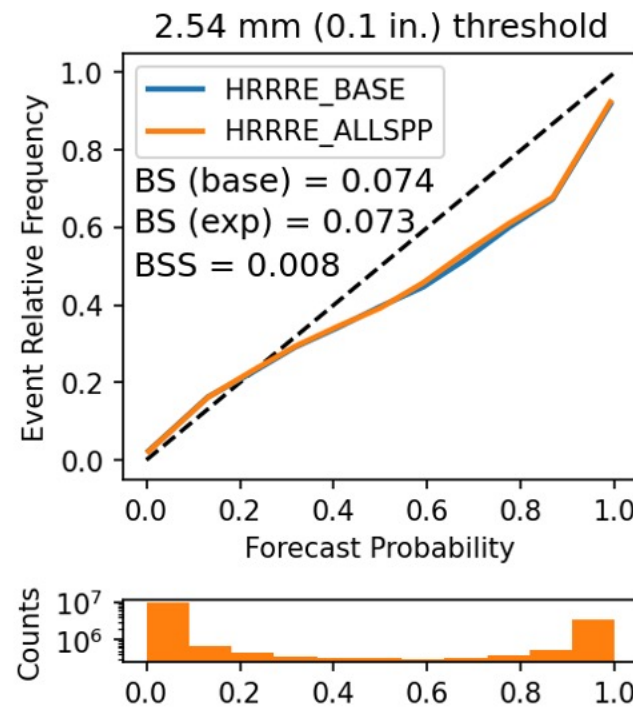


# Precip. Verification (CONUS)

48-h precip. (Stage IV) – neighborhood probs. (25 km)



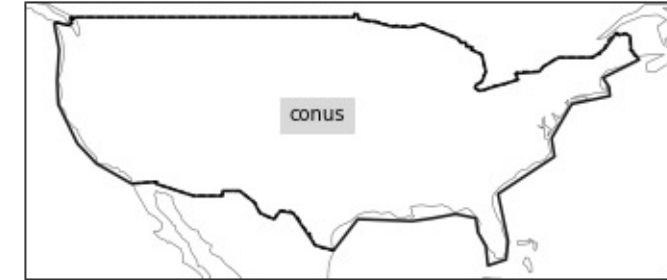
- Nearly identical performance of **baseline** and **experiment** forecasts
- Slight overforecast for higher probs.



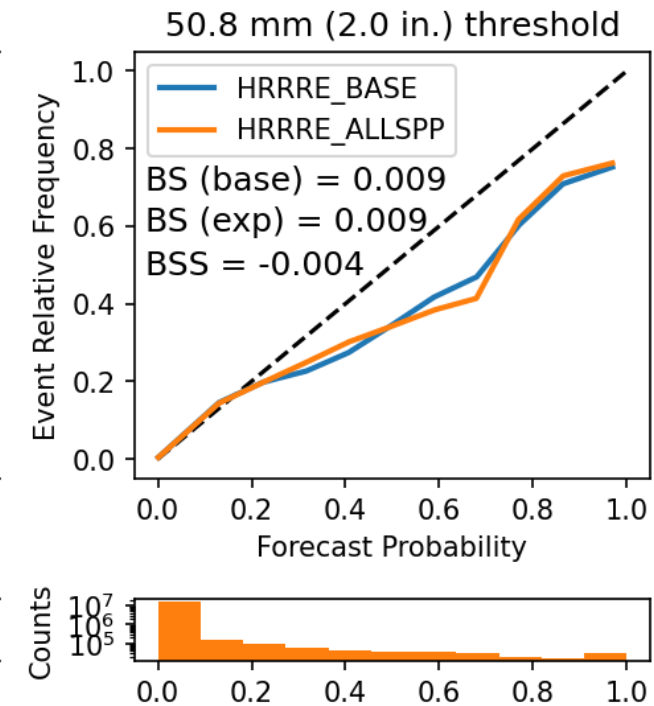
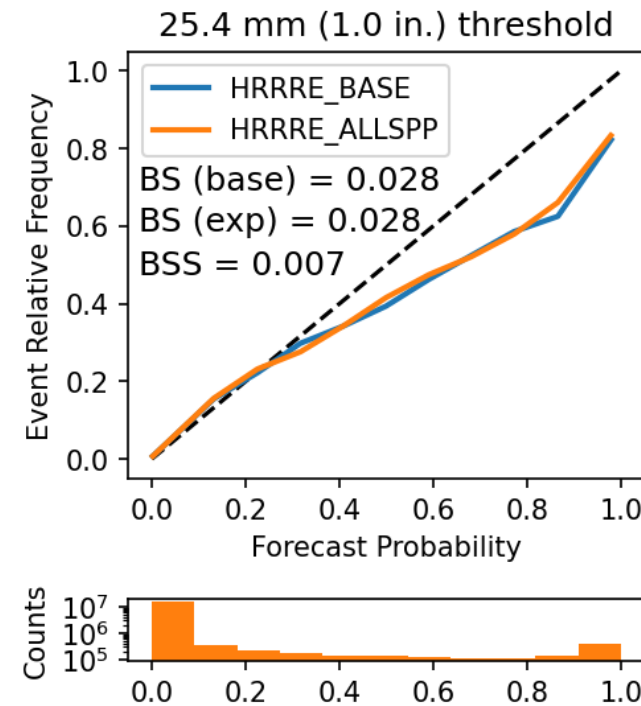
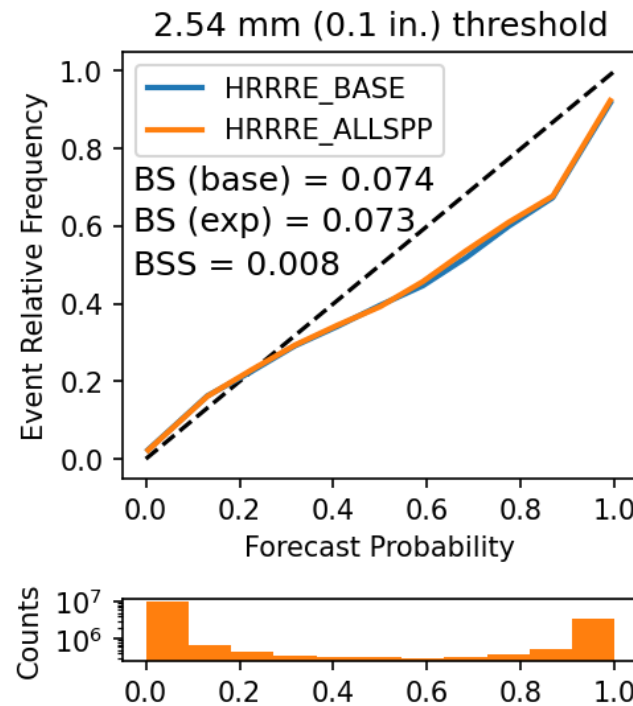


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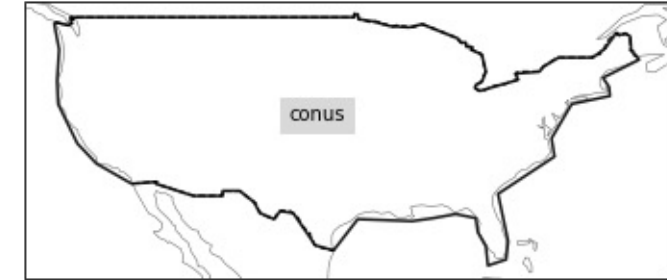
- Nearly identical performance of **baseline** and **experiment** forecasts
- Similar results using gridpoint probs.
- Regional verif. also produced similar results (not shown)



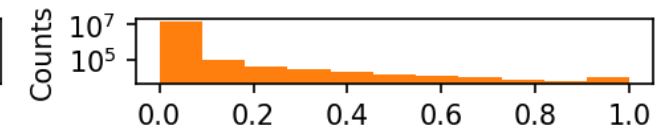
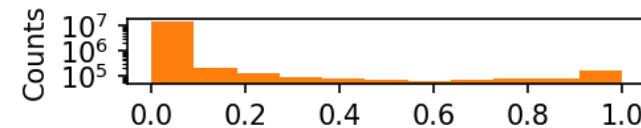
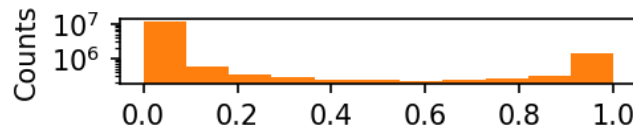
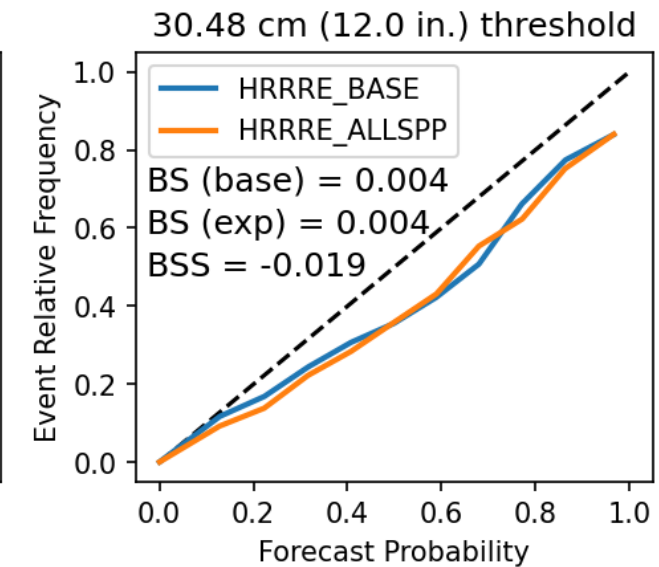
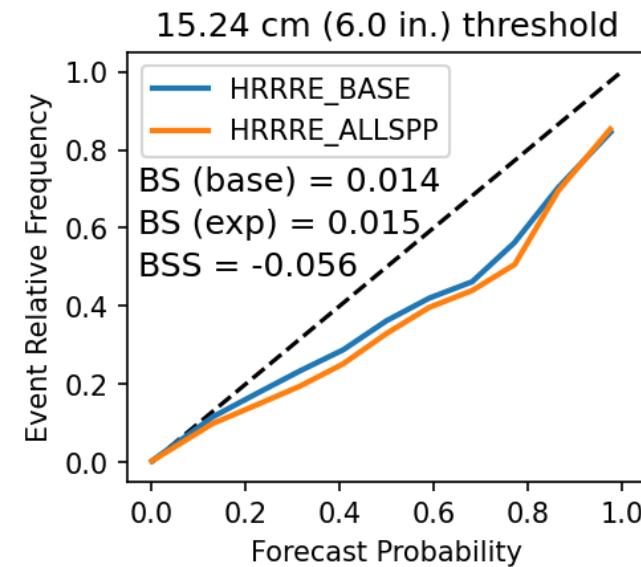
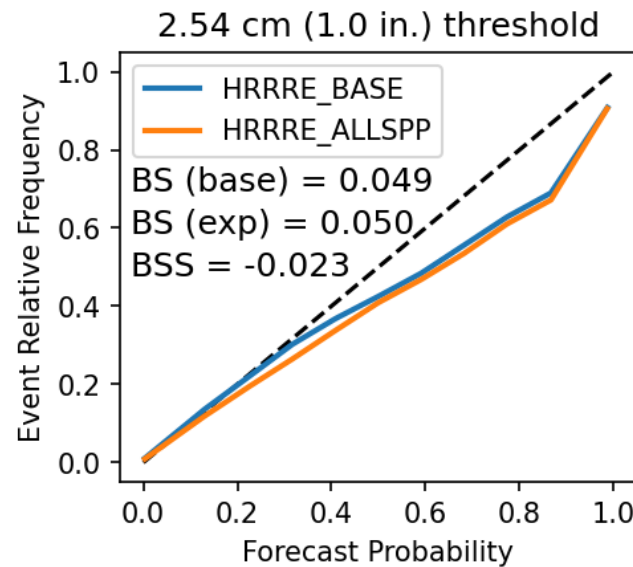
# Snowfall Verification (CONUS)

48-h snowfall (NOHRSC) – neighborhood probs. (25 km)

- Assuming fixed 10:1 SLR



- Nearly identical performance of **baseline** and **experiment** forecasts
- Slight overforecast for all snow thresholds

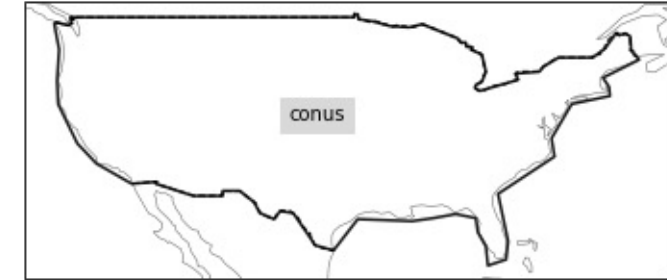




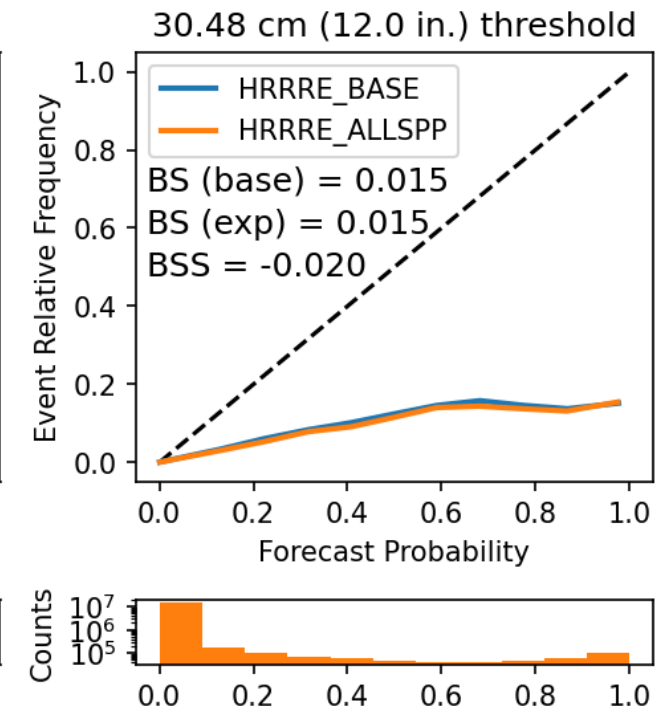
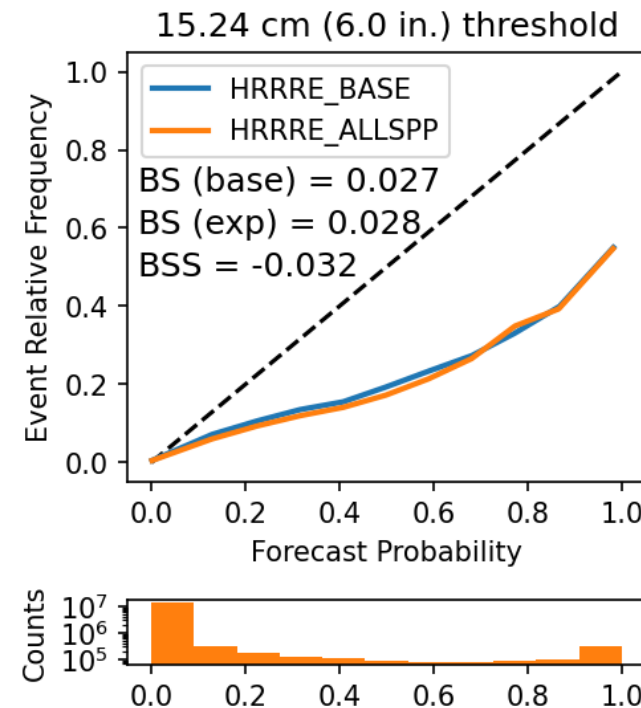
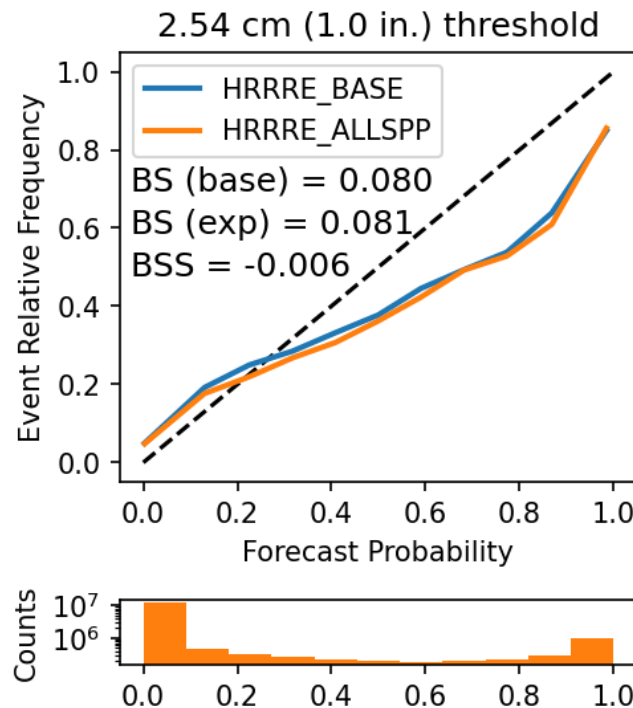
# Snowfall Verification (CONUS)

48-h snowfall (NOHRSC) – neighborhood probs. (25 km)

- Variable SLR based on low-level temp. (HRRR method)



- Nearly identical performance of **baseline** and **experiment** forecasts
- Large overforecast for higher snow thresholds (>15 cm/6 in.)

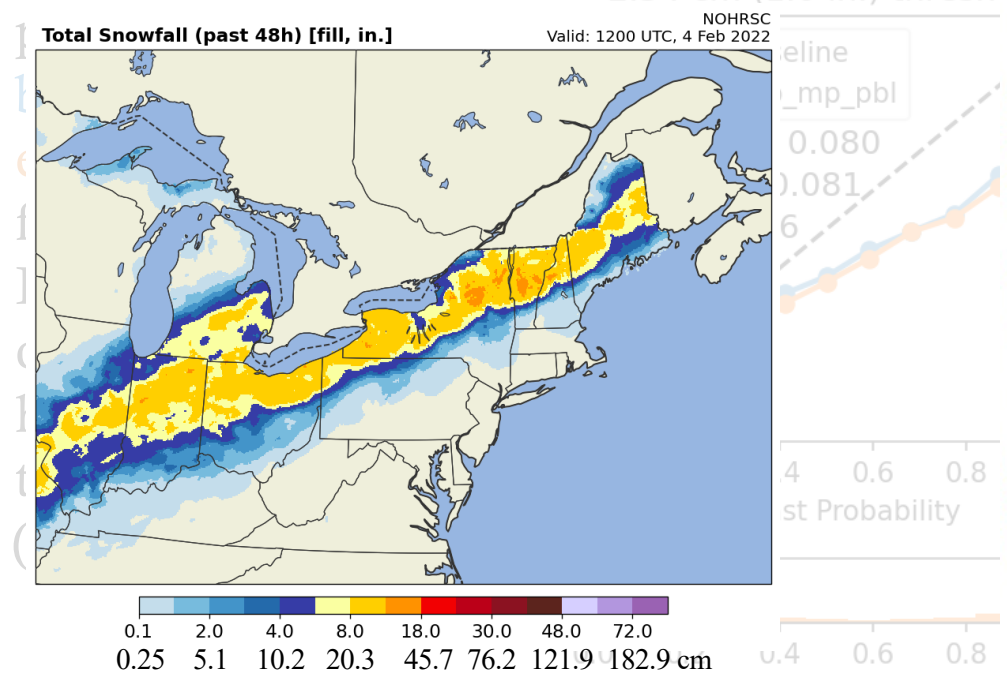


# Snowfall Verification (C)

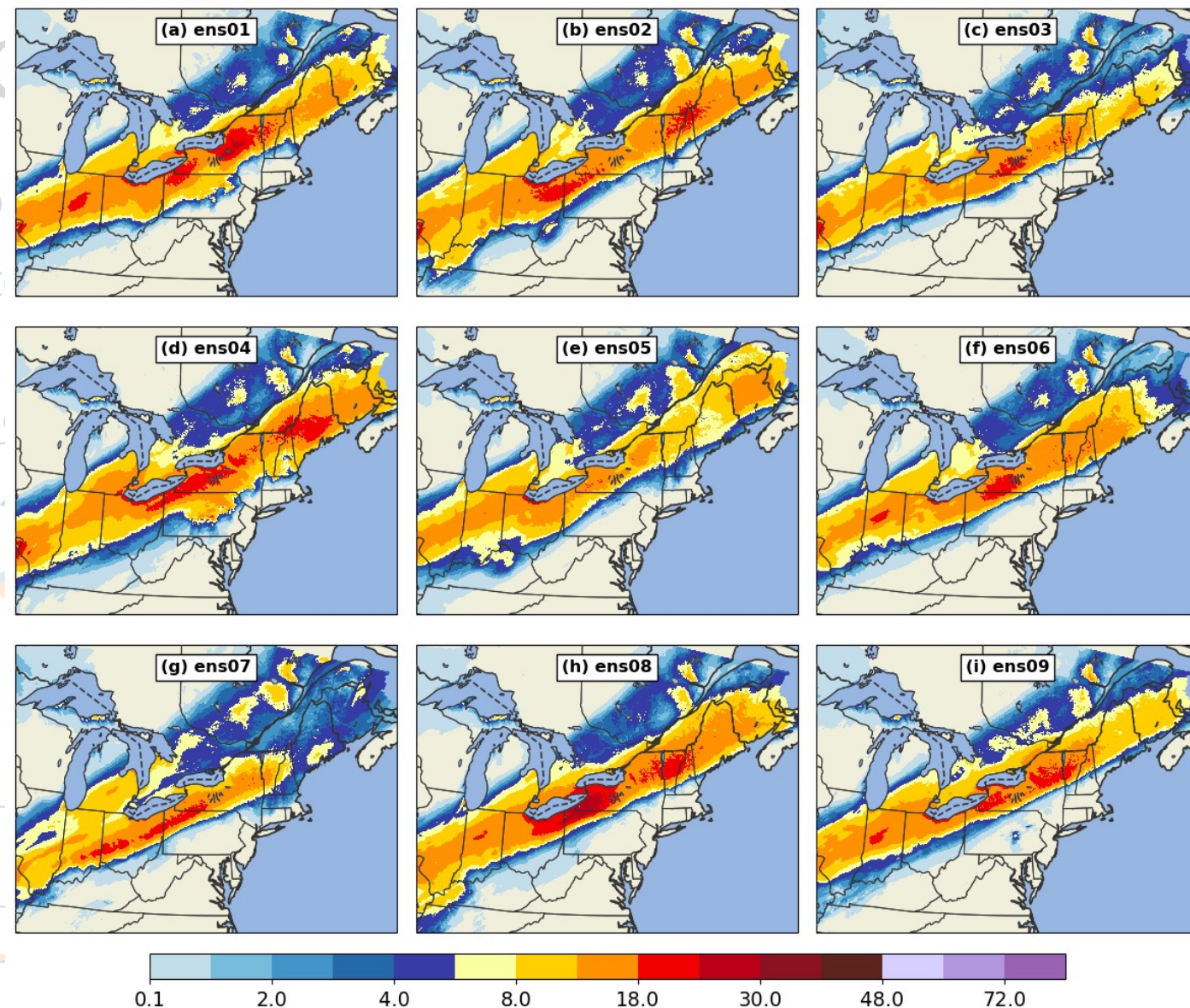
48-h snowfall (NOHRSC) – neighbor

- Variable SLR based on low-level t

- Nearly ident NOHRSC



**Total Acc. Snow Depth [fill, in.]**





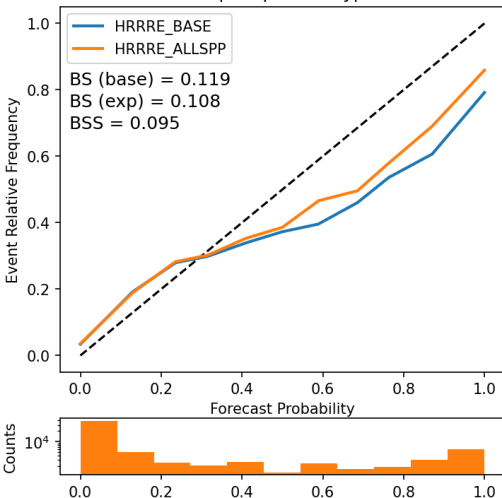
# P-Type Verification (CONUS)

1-h precip. type (mPING) – nearest gridpoint to observation

- Similar performance of **baseline** and **experiment** forecasts, **experiment** has modest improvement for several p-types (rain, snow, freezing rain)

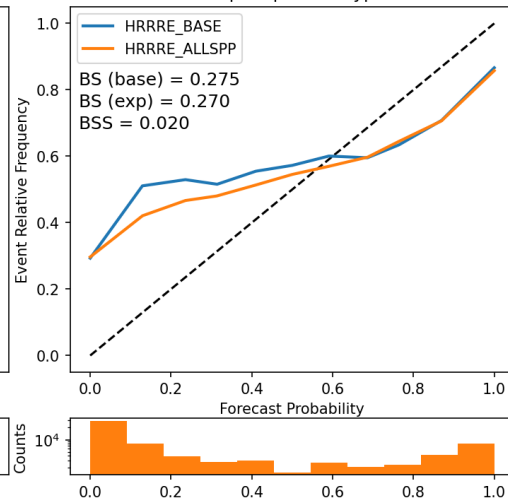
## Rain

RA precipitation type



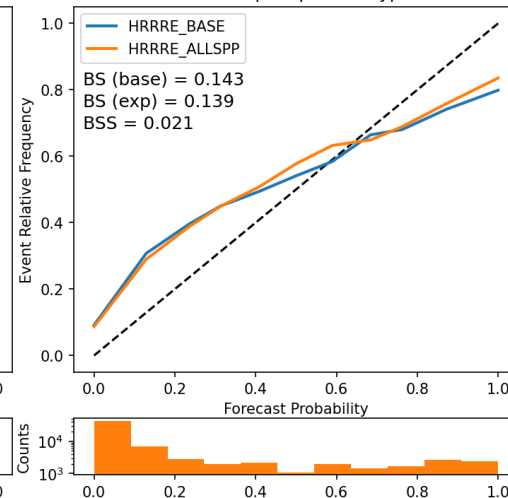
## Snow

SN precipitation type



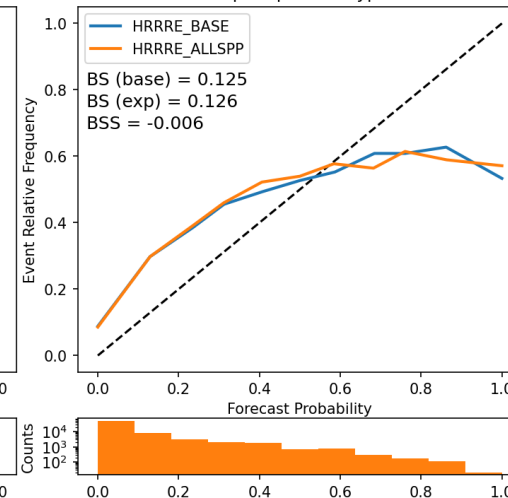
## Any mixed precip. (IP, ZR)

ANYMIX precipitation type



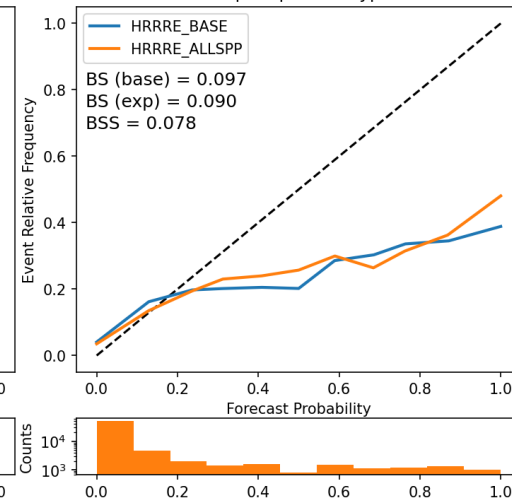
## Ice pellets

IP precipitation type



## Freezing rain

ZR precipitation type

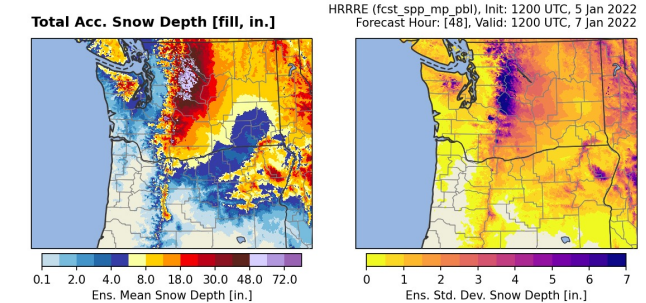


# Conclusions

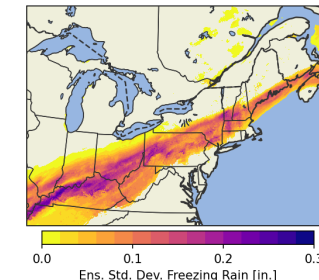
Baseline: IC/BC ens. with SPP-LSM perts.  
 Experiment: IC/BC ens. with SPP-LSM,  
 SPP-PBL, SPP-MP perts.

- **Pacific NW atmos. river case:**
  - Good forecast overall but coastal precip. dry bias
  - Similar precip. spread, **experiment** ens. has increased snowfall spread in lee of Cascades
- **Eastern U.S. mixed-precip case:**
  - Good QPF and ZR forecast, too-large snow depth forecast across interior Northeast
  - Similar precip. spread, **experiment** ens. has increased p-type spread (SN versus ZR) especially in transition zone
- **Verification:**
  - Ensembles have nearly-identical upper-level performance
  - **Experiment** ensemble has more spread in near-surface temperature (925 hPa, 2-m), but also larger RMSE and bias
  - Ensembles have similar performance in QPF and snowfall verification
  - P-type verification shows modest improvement in **experiment** ens. for RA, SN, ZR
  - Variable SLR method overforecasts larger snowfall amounts (> 6 in.) compared to fixed 10:1 SLR

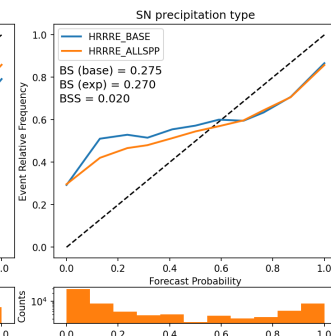
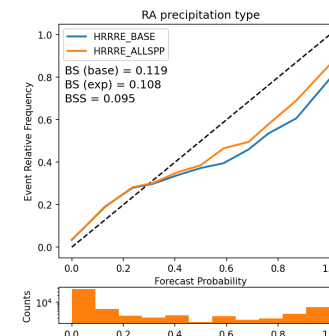
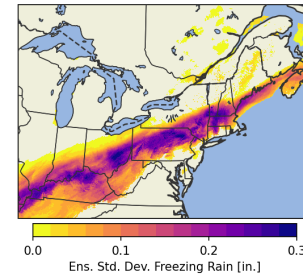
## Experiment



## Baseline



## Experiment



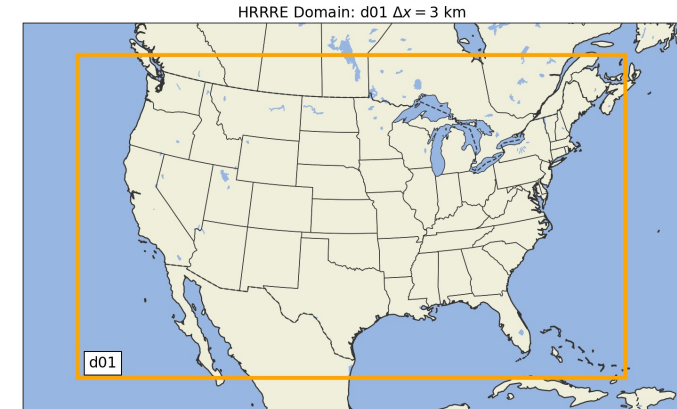




# Physics uncertainty in high-res. ensembles

## *WPC-HMT: 2021-22 WWE Ensemble Configuration*

- Forecasts run by NOAA-GSL (David Dowell, Isidora Jankov, Trevor Alcott)
- WRF v3.9+
- HRRRE configuration, with only SPP active (no SPPT)
- HRRRDAS ICs, GEFS BCs
- All forecasts initialized at 12 UTC and run for 48h, 21 total cases between Dec 2021 and Mar 2022
- MYNN Level 2.5 PBL scheme and Thompson-Eidhammer aerosol-aware MP
- **During WWE, tested two ensemble configurations (9 members each)**



Physics Scheme	SPP Parameters Perturbed
Planetary boundary-layer (MYNN-EDMF)	Eddy diffusivity, eddy viscosity, lateral entrainment rate, background water vapor specific humidity
Surface-layer physics (MYNN)	Aerodynamic, thermal, and moisture roughness lengths
Gravity wave drag (GWD-GSL)	Standard deviation of subgrid-scale terrain variations
Microphysics (Thompson-Eidhammer)	Graupel y-intercept param., cloud water shape param., activation frac. of CCN/IN, snow mass- and velocity-diameter coeffs., snow capacitance
Land surface physics (RUC LSM)	Surface emissivity, albedo, vegetation fraction
Horiz. diffusion (Smagorinsky)	Smagorinsky constant
Cumulus physics (Grell-Freitas)	Cloud-base mass flux closures