

# MDL Postprocessing Data Needs, Techniques, and Skill

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# Meteorological Development Laboratory (MDL)



## Digital Forecast Services Branch

- National Digital Forecast Database (NDFD)
- Localized Aviation MOS Product (LAMP)
- Evaluation of forecasts and guidance

## Statistical Modeling Branch

- National Blend of Models
- Model Output Statistics (MOS)
- High-quality model and observation archives

**MDL**

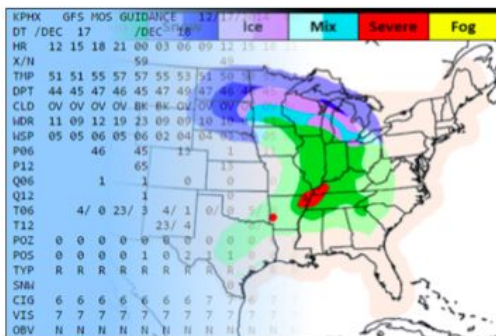
## Weather Information Applications Branch

- Web services
- Metadata
- Data modeling

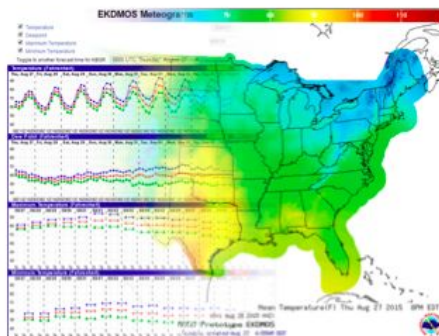
## Decision Support Branch

- IRIS/Impacts Catalog
- Storm Surge
- Virtual Laboratory (VLab)

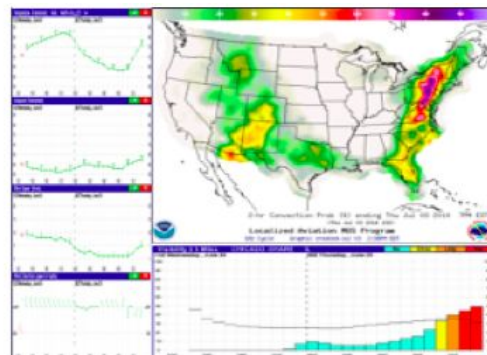
# Overview of Statistical Postprocessing At MDL



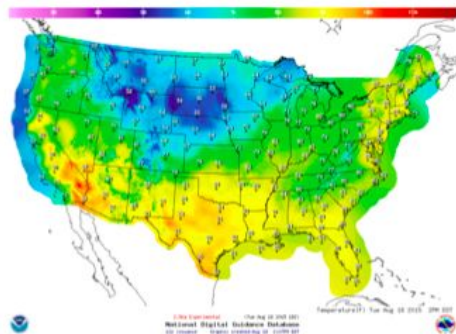
Model Output Statistics



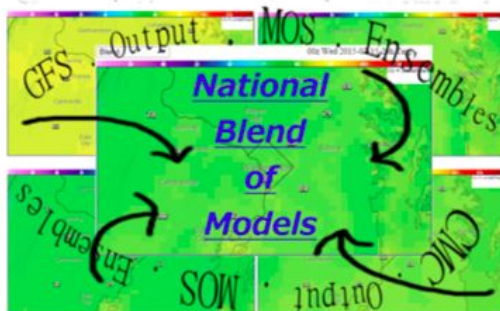
Ensemble Kernel Density MOS (EKDMOS)



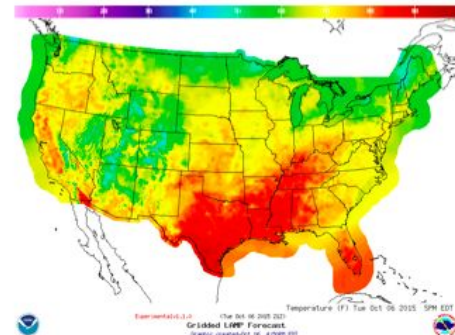
Localized Aviation MOS Program (LAMP)



Gridded MOS (GMOS)



National Blend of Models (NBM)



Gridded LAMP (GLMP)

# Model Output Statistics (MOS)

- MOS relates observed weather elements (predictands) to appropriate variables (predictors) via statistical methods
- Multiple Linear Regression with Forward Screening Selection

$$Y = b + a_1X_1 + a_2X_2 + a_3X_3 + \dots + a_nX_n$$

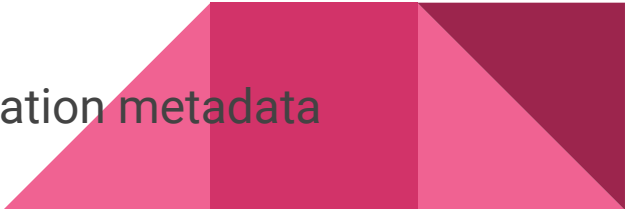
- Often apply non-linear transformations to the predictor variables
  - Grid Binaries -- PQPF
  - Logistic Transformations -- GMOS Precip Type (Shafer 2010)
  - Interactive Predictors -- HiRes GMOS QPF -- (Charba and Samplatsky, 2011)

# Predictor Data Sources

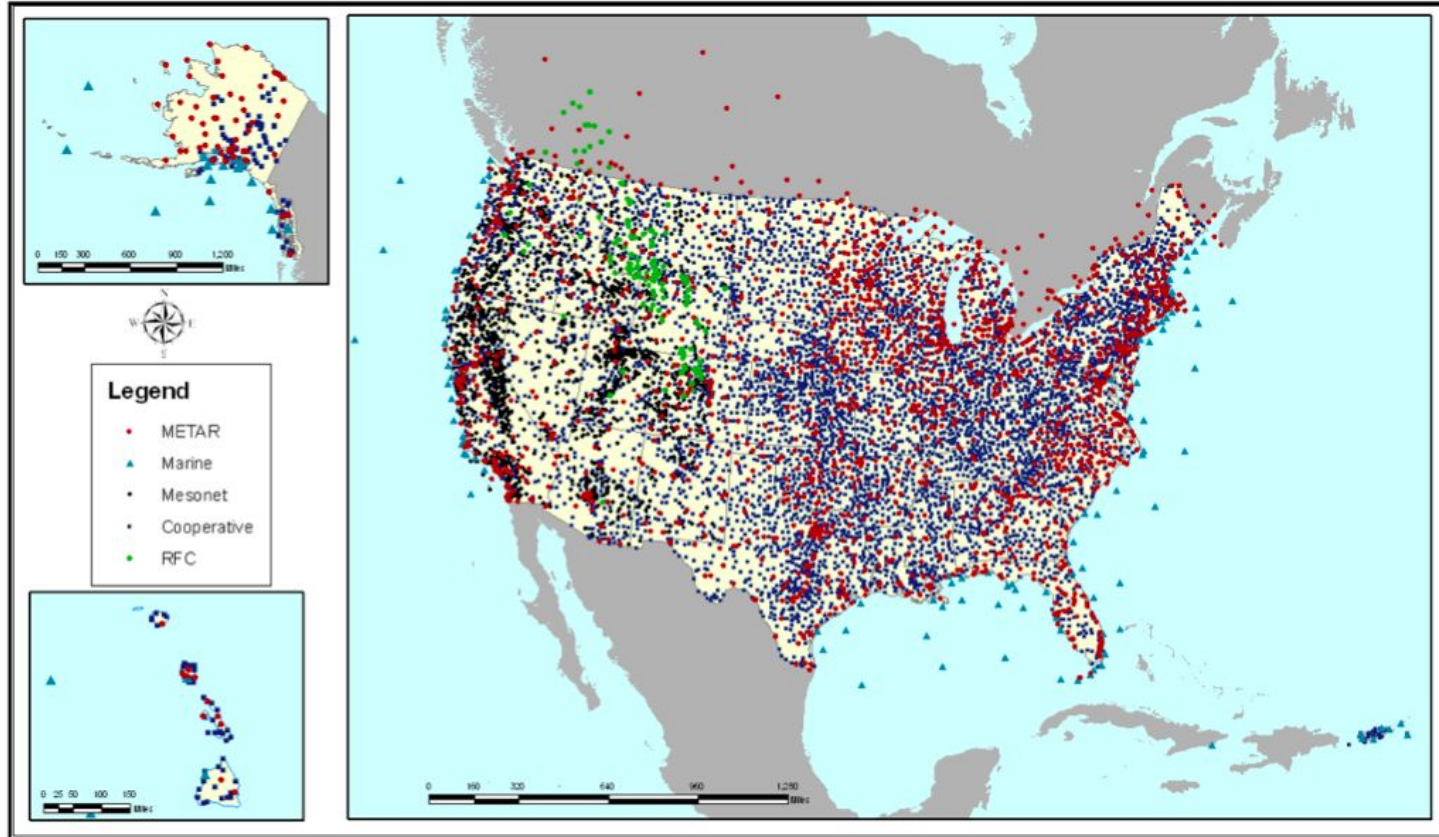
- Predictors usually obtained from
  - Numerical Weather Prediction (NWP) Output
  - Prior Surface Weather Observations
  - Geoclimatic Information



# Observational Data Sources

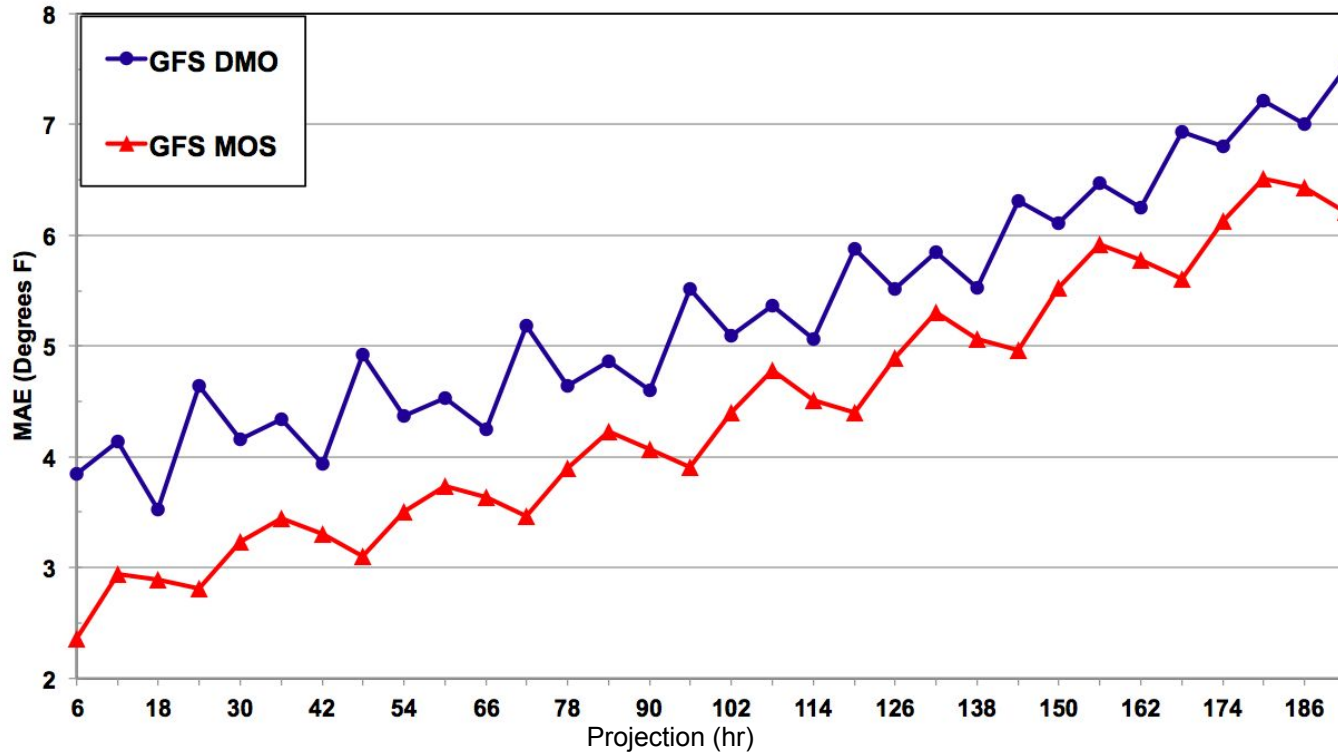
- METAR
  - Marine - buoy and Coastal-automated Marine Networks (CMAN)
  - Lightning Data
    - Vaisala's National Lightning Detection Network
    - Bureau of Land Management
    - Earth Networks Inc. Total Lightning
  - NCDC cooperative observer data - (COOP)
  - GOES Satellite Cloud Product (SCP)
  - MADIS mesonet observations
  - Multi-Radar/Multi-Sensor System (MRMS)
  - Geophysical data - terrain, land cover, climatology, station metadata
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# Station-based Data Sources



# Why Use MOS?

2-M Temperature Mean Absolute Error at 1315 CONUS Stations



Temperature Verification - 0000 UTC GFS MOS vs. GFS DMO (10/2011 - 3/2012)



# MOS Development Challenges

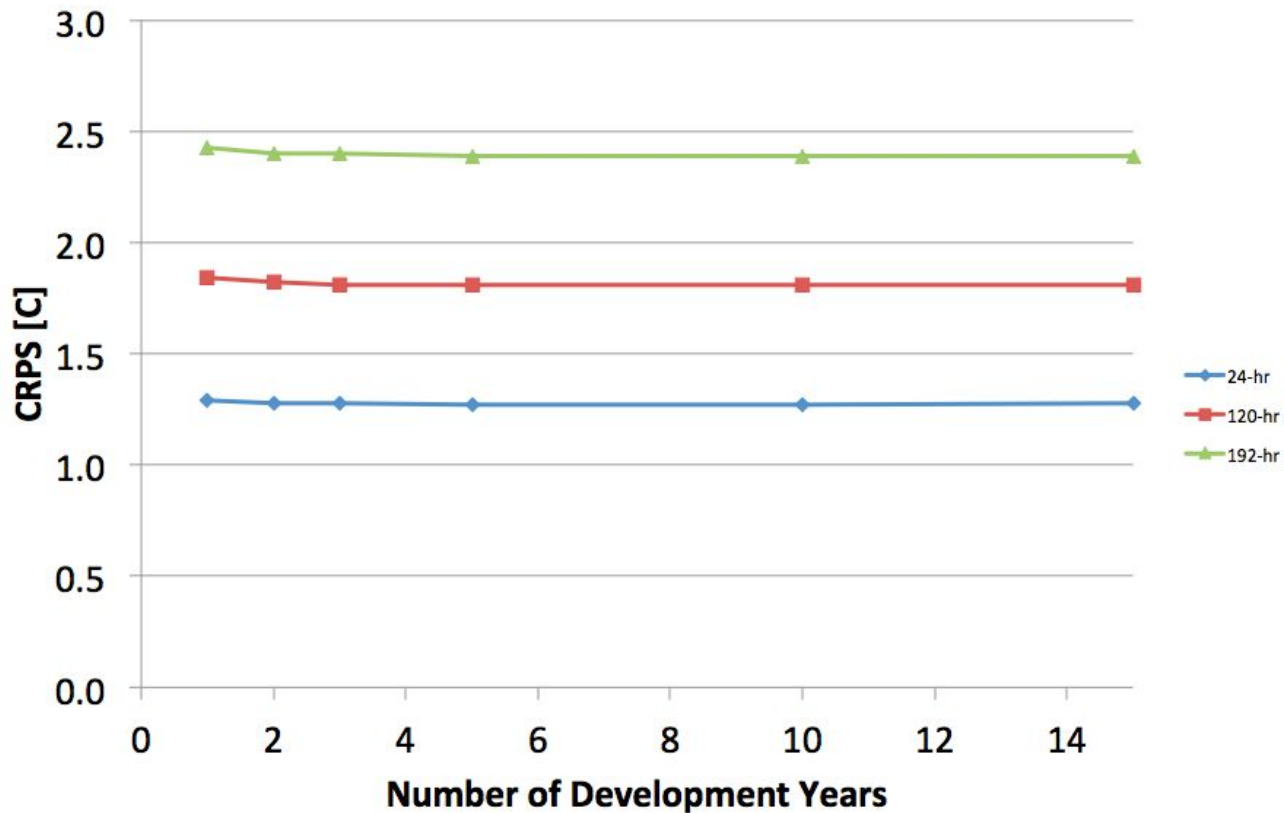
- Rapidly evolving NWP systems and observation platforms
  - Model upgrades can alter underlying model biases and degrade MOS
  - Short, unrepresentative forecast samples
  - Difficulty collecting appropriate predictand data
- Reforecast datasets would benefit MOS development



# How much reforecast data is ideal for MOS?

- Conducted sample size sensitivity tests using the second generation GEFS 30-year reforecast dataset (Hamill et al. 2013)
- Developed station-based MOS/EKDMOS equations
  - Training Samples Sizes: 15 years, 10 years, 5 years, 3 years, 2 years, and 1 year
  - Temperature (EKDMOS)
  - Wind Speed and Precipitation Type (MOS)
- Generated 13 years of independent forecasts
- Hamill et al. 2014 -- “A Recommended Reforecast Configuration for the NCEP Global Ensemble Forecast System”

### 2-m Temperature, CRPS [C], Cool Season, 2000-2012, 335 Stations



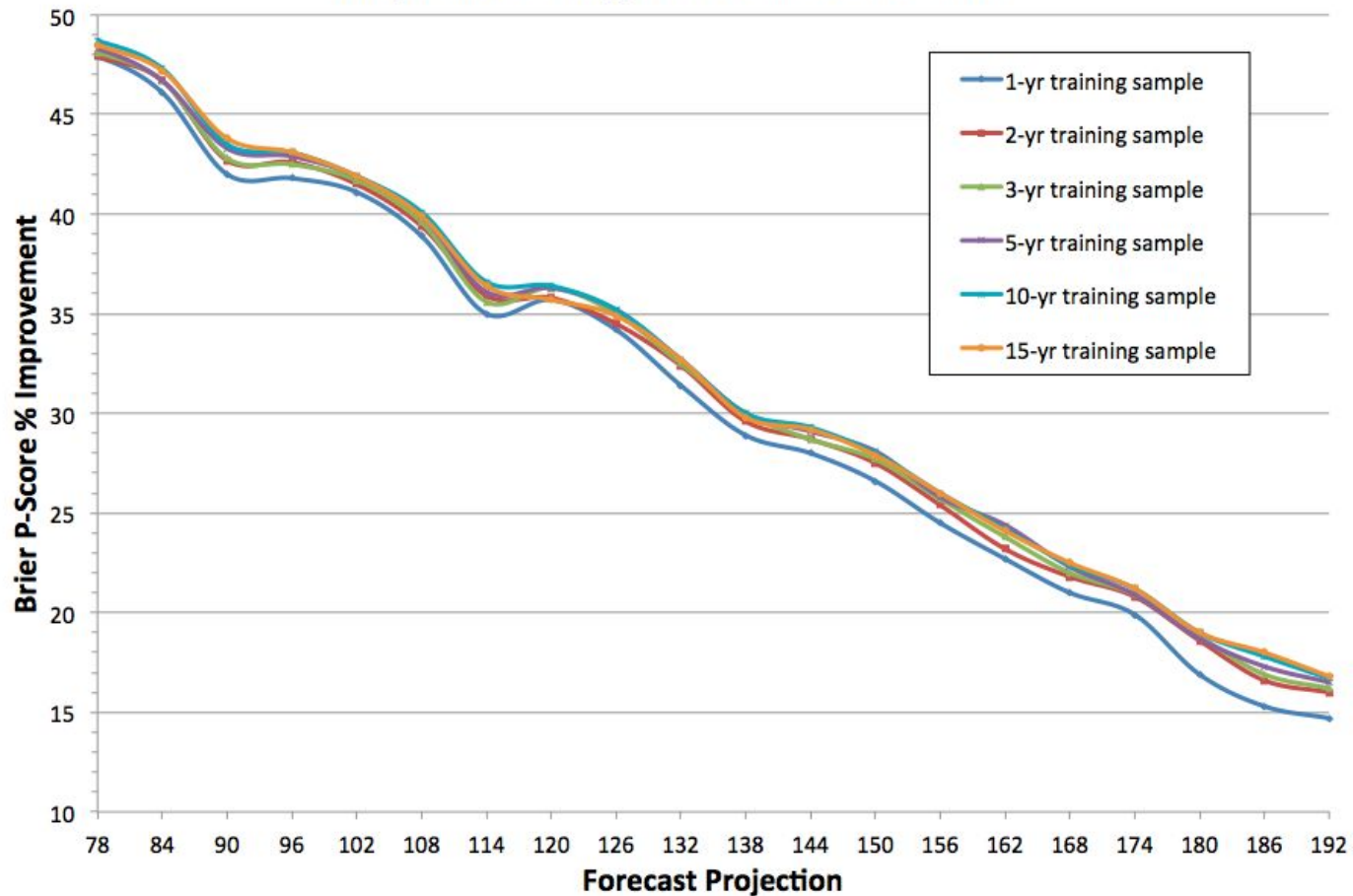
# Cool Seasons: 2000/2001 - 2012/2013

## Wind Speed $\geq$ 10 Kts - 00Z GEFS MOS - MAE

### Overall (334 Stations)



# 0000 UTC GEFS MOS Probabilistic Precipitation Type (3-category) Sample Size Testing: 2001-2012 Cool Seasons



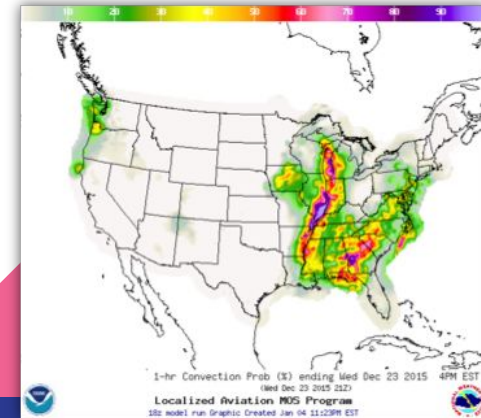
# Sample Size Sensitivity Experiment Summary

- 3 to 5 years of reforecast data was sufficient for developing MOS equations
  - Temperature
  - Wind Speed
  - Precipitation Type
- Results may vary for other elements



# The Localized Aviation MOS Program (LAMP)

- Objective -- Improve on MOS forecasts and persistence out to at least 25 hours through rapid infusion of current observational data
- 24 cycles of LAMP per day
- Focus on weather elements that are critical to the aviation community, such as: ceiling height, visibility, winds, and convection



# LAMP Statistical Postprocessing Challenges

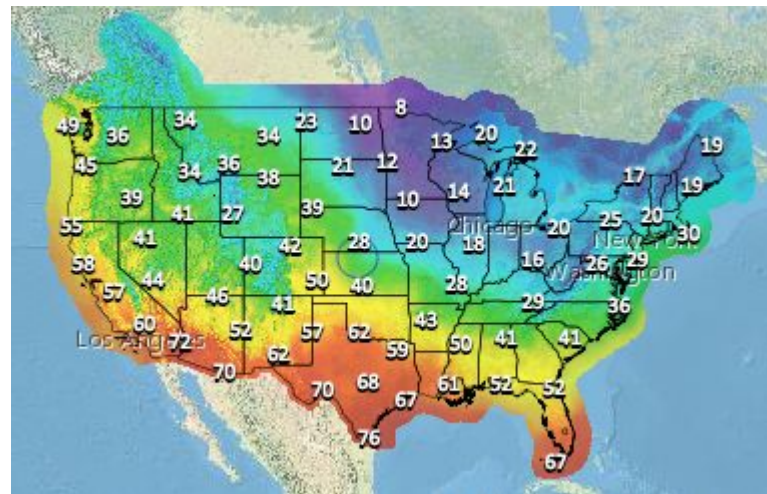
- Good observations are critical to the LAMP process.
- Many aviation elements are non-normally distributed and discontinuous in nature.
- Rapidly-changing models are problematic for LAMP since hourly cycles are very time-intensive to re-develop (24 cycles, 2 seasons, backup & primary eqns).





# The National Blend of Models (NBM)

- Combines forecasts from multiple NWP models to create calibrated, blended guidance on the NDFD domains
- The UnRestricted Mesoscale Analysis (URMA) is used for calibration
- Components are blended based on recent MAEs (prior ~20 days)



NBM 48-hr Max T: Issued 18 Jan. 2016 00z Cycle

# NBM Dataflow

When blend inputs change...

Inputs

Gridded MOS Guidance:  
GFS (GMOS),  
NAEFS (EKDMOS)

Direct Model Output:  
GFS, GEFS, CMCE

Daily Training

URMA 2.5 km  
CONUS

Update  
biases and  
MAEs

Need to recalibrate

Biases

MAEs

Blended Guidance Generation

Latest  
Gridded MOS  
and DMO Inputs

Bias-Corrected  
Grids

Calibrated  
Consensus  
Forecasts

# Conclusions

- Greatest challenges for statistical postprocessing at MDL
  - Rapidly-changing models
  - Requirement to produce gridded guidance without adequate gridded observations for training and verification
  - Obtaining a sufficient sample or reanalysis of gridded observations (i.e. URMA)
- For each major model change
  - MOS/LAMP require 3-5 years of reforecasts to recalibrate
  - The National Blend of Models requires 30 days to recalculate biases and MAEs



# References

- Charba, J.P., and F.G. Samplatsky, 2011: [High resolution GFS-based MOS quantitative precipitation forecasts on a 4-km grid](#). *Mon. Wea. Rev.*, 139, 39-68.
- Hamill, T. M., G.T. Bates, J. S. Whitaker, D. R. Murray, M. Fiorino, T. J. Galarneau, Y. Zhu, and W. Lapenta, 2013: NOAA's Second- Generation Global Medium- Range Ensemble Forecast Dataset. *Bull. Amer. Meteor. Soc.*, 94, 1553-1565.
- Shafer, Phillip E., 2010: [Logit transforms in forecasting precipitation type](#). *Preprints, 20th Conf. on Probability and Statistics in the Atmospheric Sciences*, Atlanta, GA, Amer. Meteor. Soc.

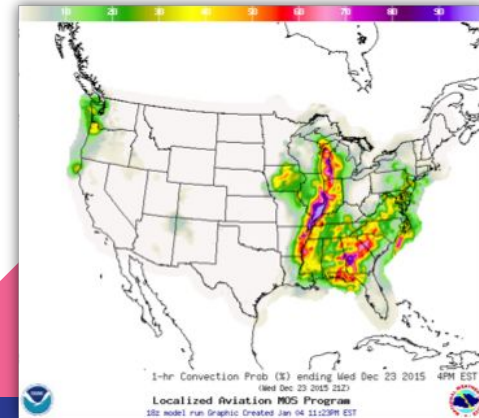


# Backup Slides



# The Localized Aviation MOS Program (LAMP)

- Objective -- Improve on MOS forecasts and persistence out to at least 25 hours through rapid infusion of current observational data
- Project Goals:
  - Develop improved LAMP guidance for use in aviation forecasting
    - Provide station-based LAMP guidance valid at NWS TAF stations
    - Provide gridded LAMP guidance for inclusion in NWS Enhanced Digital Services
  - Focus on weather elements that are critical to the aviation community, such as: ceiling height, visibility, winds, and convection



# LAMP Statistical Postprocessing

- LAMP combines METAR, radar, satellite cloud product, and lightning observations with forecasts from MOS and direct model output to create station-based and gridded guidance via multiple linear regression.
- LAMP runs hourly and includes the most recent observations to produce valuable guidance in the short-range period for the aviation community.
- Good observations are critical to the LAMP process.
- Many aviation elements are non-normally distributed and discontinuous in nature, which poses unique challenges for statistical postprocessing.
- Rapidly-changing models are problematic for LAMP since hourly cycles are very time-intensive to re-develop (24 cycles, 2 seasons, backup & primary eqns).



# MOS Operational System on WCOSS

- 9 million regression equations
  - 75 million forecasts per day
  - 1200 products sent daily
  - 400,000 lines of code – mostly FORTRAN
  - 180 min. of supercomputer time daily
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