

EXTRACTING UNCERTAINTY FROM WEATHER FORECASTS

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NOAA/GSD/Forecast Impact and Quality Assessment Section

UVIG 2017

6/20/2017



Who is FIQAS not?

The Forecast Impact and Quality Assessment Section

Who we are not:

~~FICUS~~



Who is FIQAS not?

The Forecast Impact and Quality Assessment Section

Who we are not:



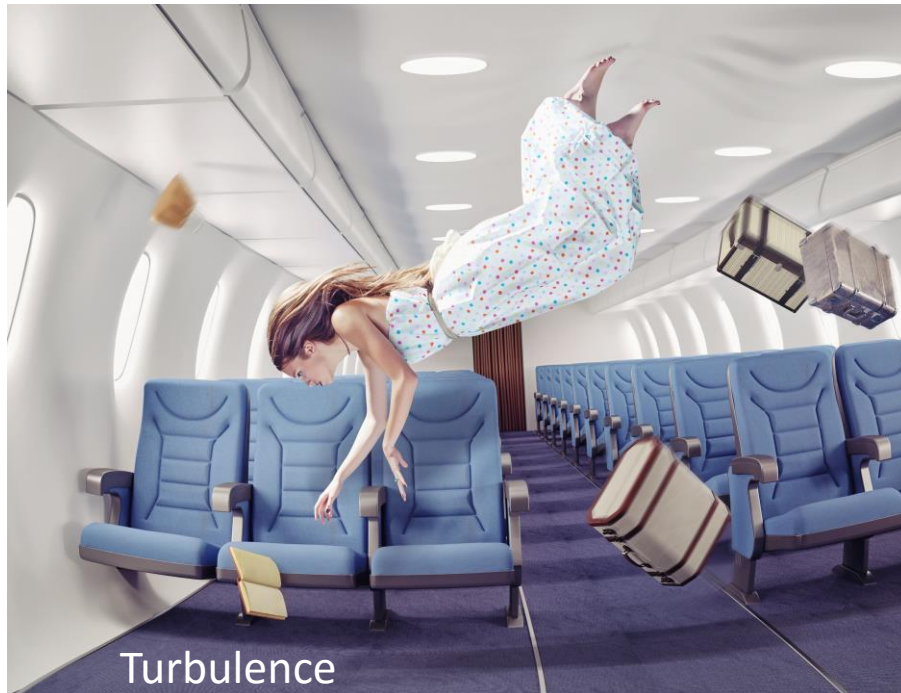
Who is FIQAS?

The Forecast Impact and Quality Assessment Section

We work primarily in the aviation realm doing

- Forecast verification for the FAA and NWS with a heavy focus on the context of how the forecasts are used
- Decision Support
- Common features of our work
 - Use multiple perspectives/approaches in an evaluation to get a comprehensive view
 - Verifying poorly observed/sampled phenomena (e.g., icing, turbulence)
 - Concerned with not just the weather itself, but the impact of the weather

Aviation Weather



Aircraft Icing

Uncertainty in Weather Forecasts

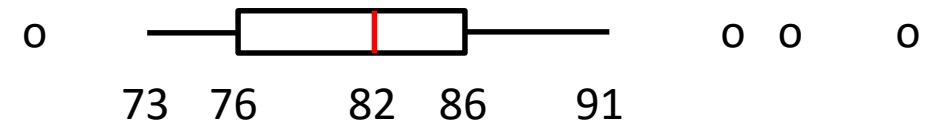
Statistical — climatologies

- Climatology, $p(o)$

In the past, forecasts had errors of $\pm 5^\circ$, Forecast = $80^\circ\text{F} \rightarrow 75^\circ$ to 85°F

- Conditional climatology, $p(o | f)$

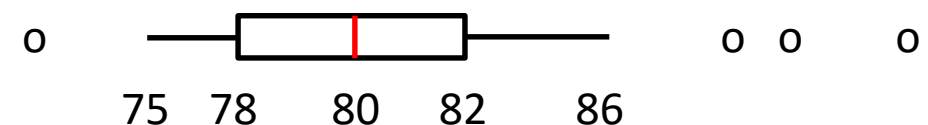
In the past, when Forecast = 80°F , Obs =



- Model Output Statistics (MOS), multiple linear regression/logistic regression

In the past, when Forecast T = 80°F , RH = 70%, P = 1014 mb, and W = 12 mph from SW

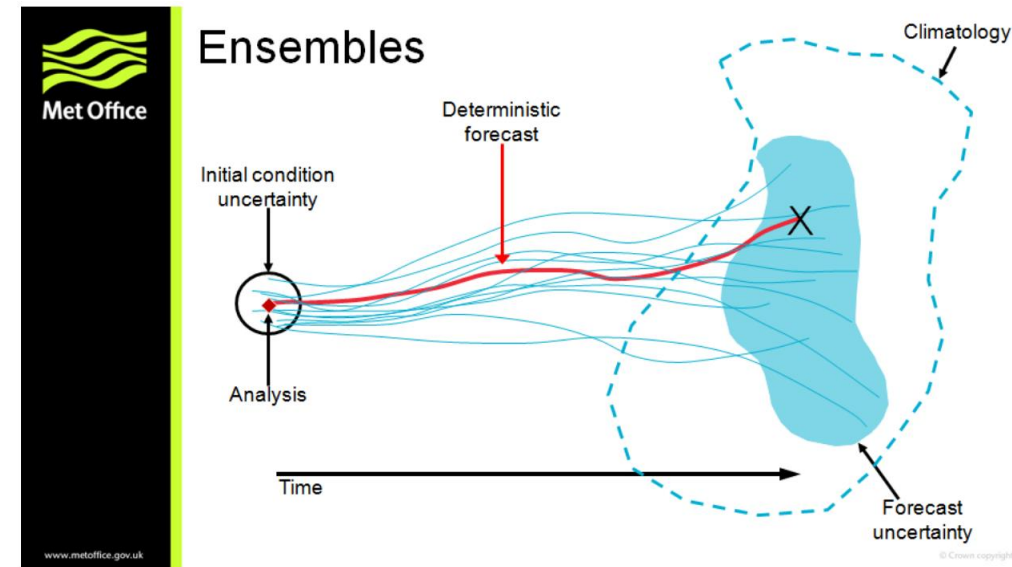
Obs =



Uncertainty in Weather Forecasts

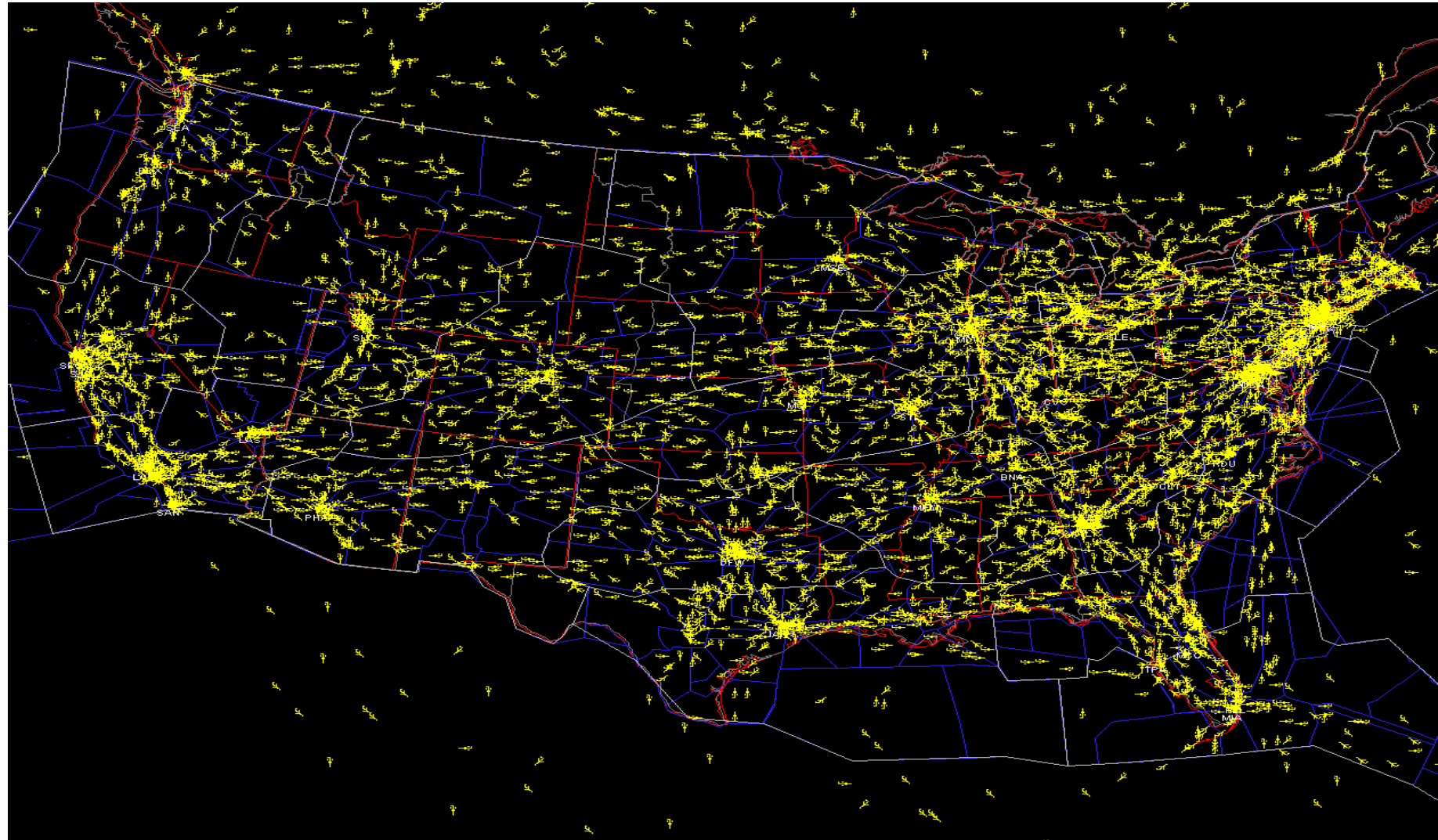
Dynamic — ensembles

- Single Center (e.g., ECMWF)
 - Often underdispersive -- too confident
- Multiple Centers (e.g., NAEFS = GEFS + CMC)
 - Can produce bimodal distributions, which can give misleading information, e.g., the mean of the combined distribution is not as likely as the means of either
- Ensemble of Opportunity (aka Poor Man's Ensemble)
 - Mix of physics, initial conditions, etc., often more dispersive, but typically fewer members—less robust statistics without more involved post-processing



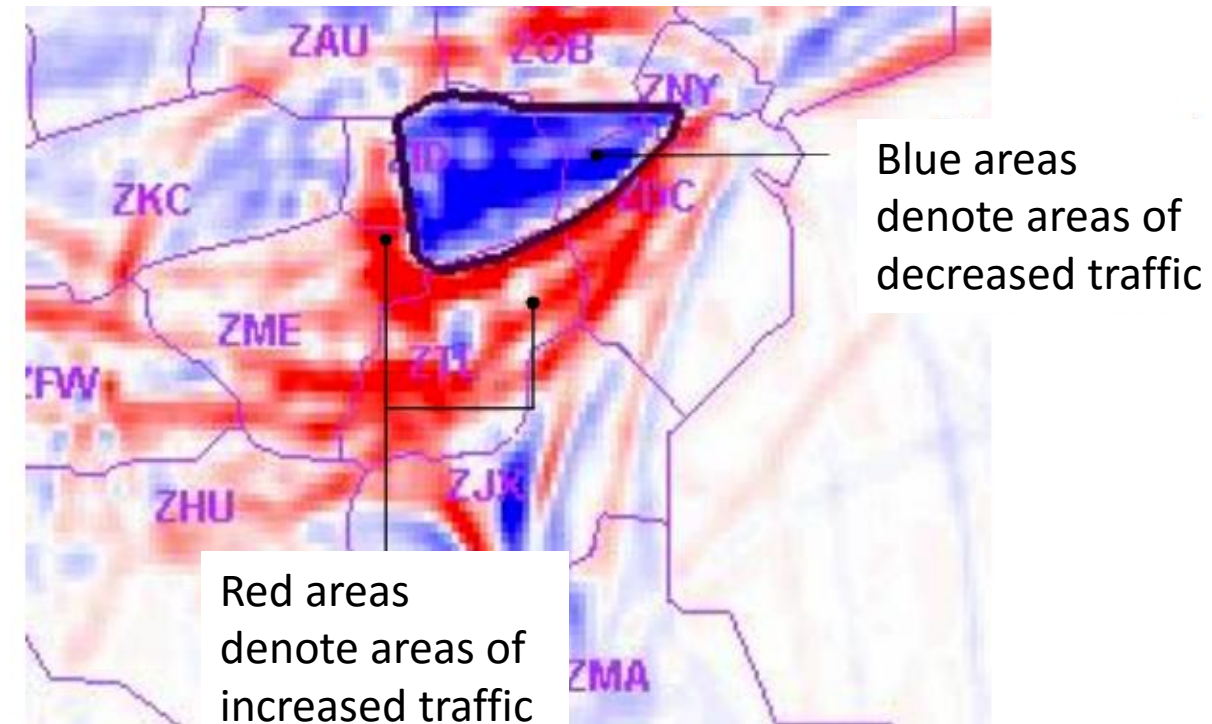
Aviation decision making

- Complex routing decisions to minimize disruptions to air traffic



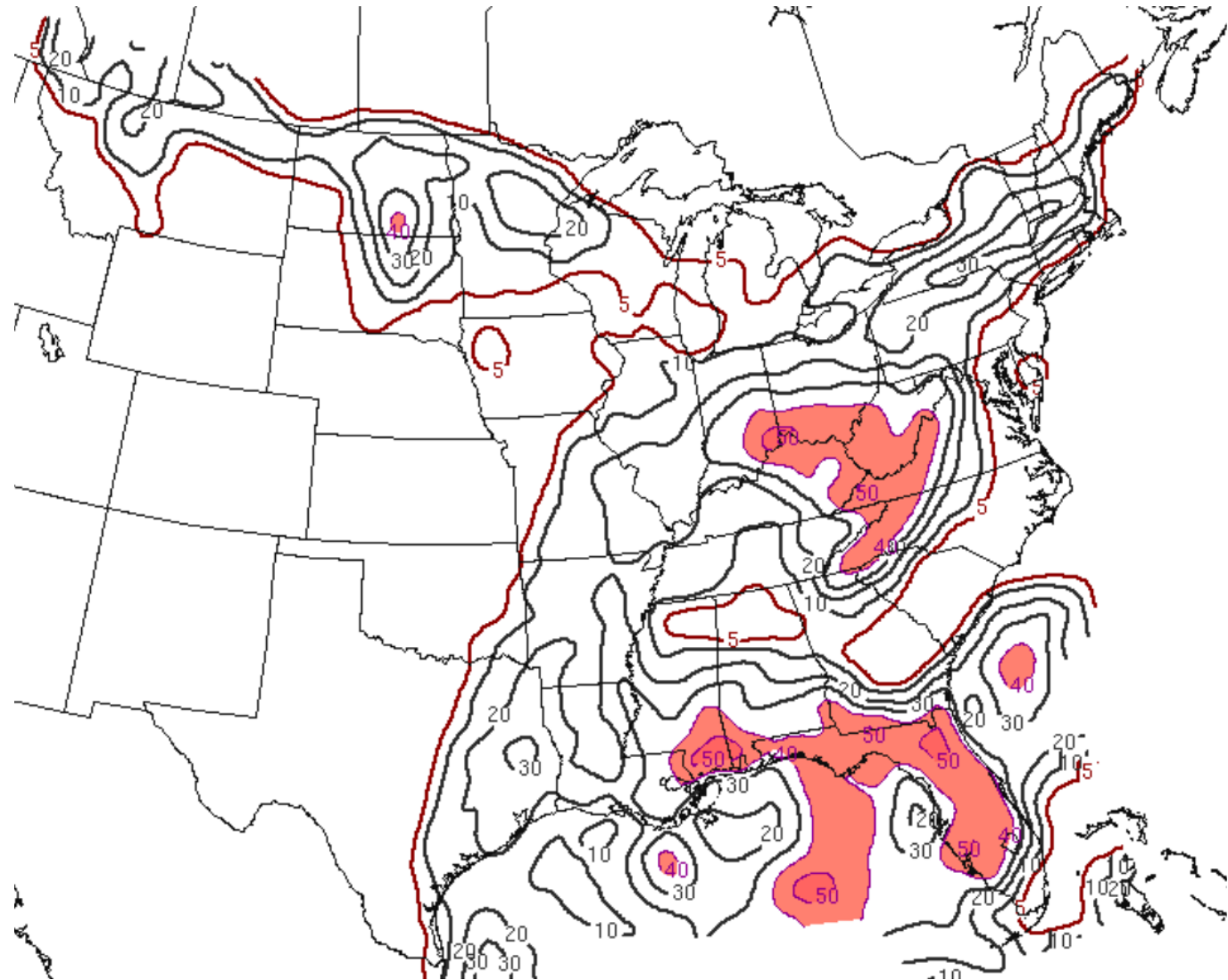
Aviation decision making

- Very sensitive to route blockage by thunderstorms
- But location and timing of thunderstorms is highly uncertain



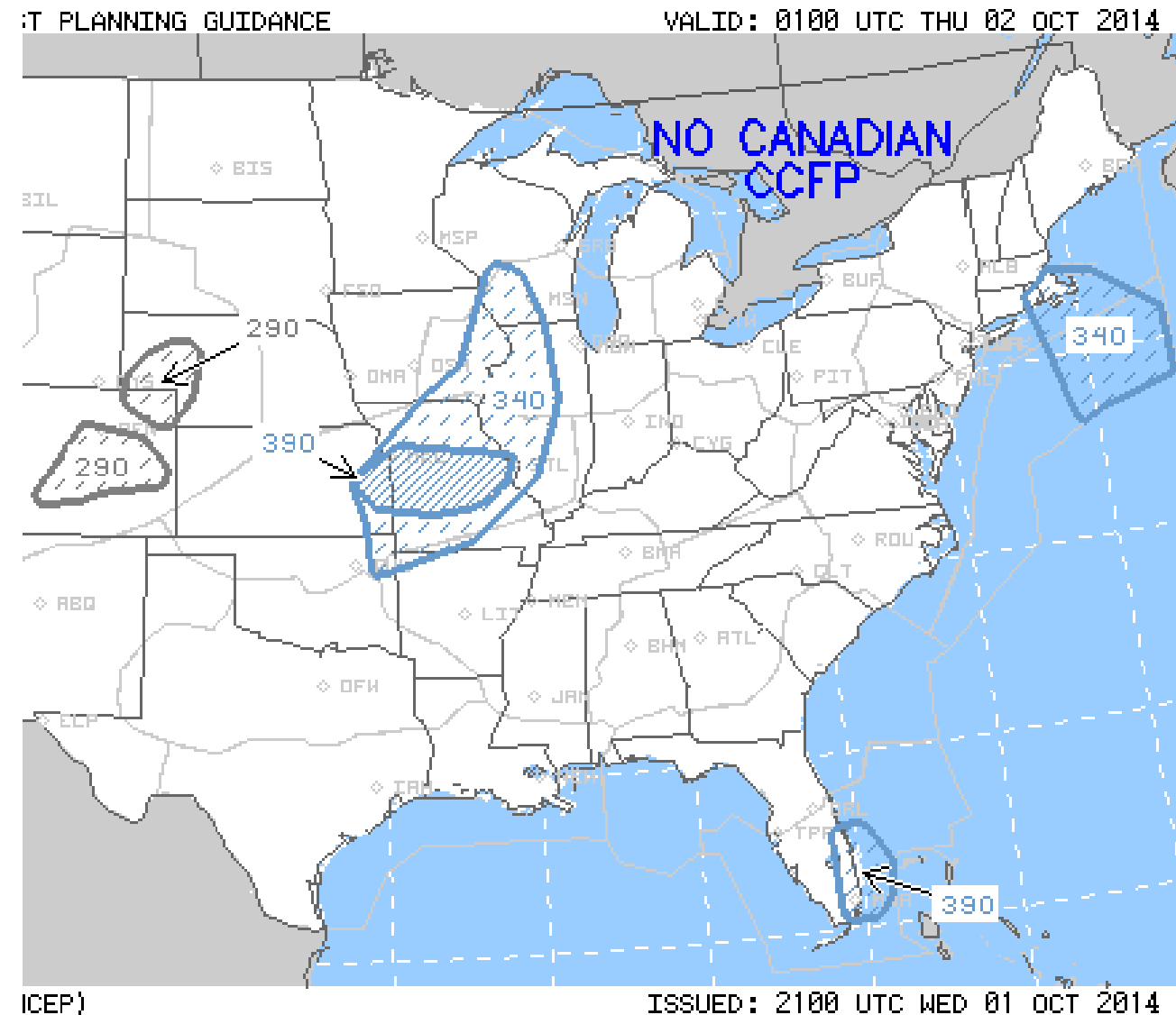
Aviation decision making—uncertainty

- Probability of thunderstorm
- No information about type of storms (e.g., line, cluster, isolated storms), coverage, height of storms, storm motion, etc.



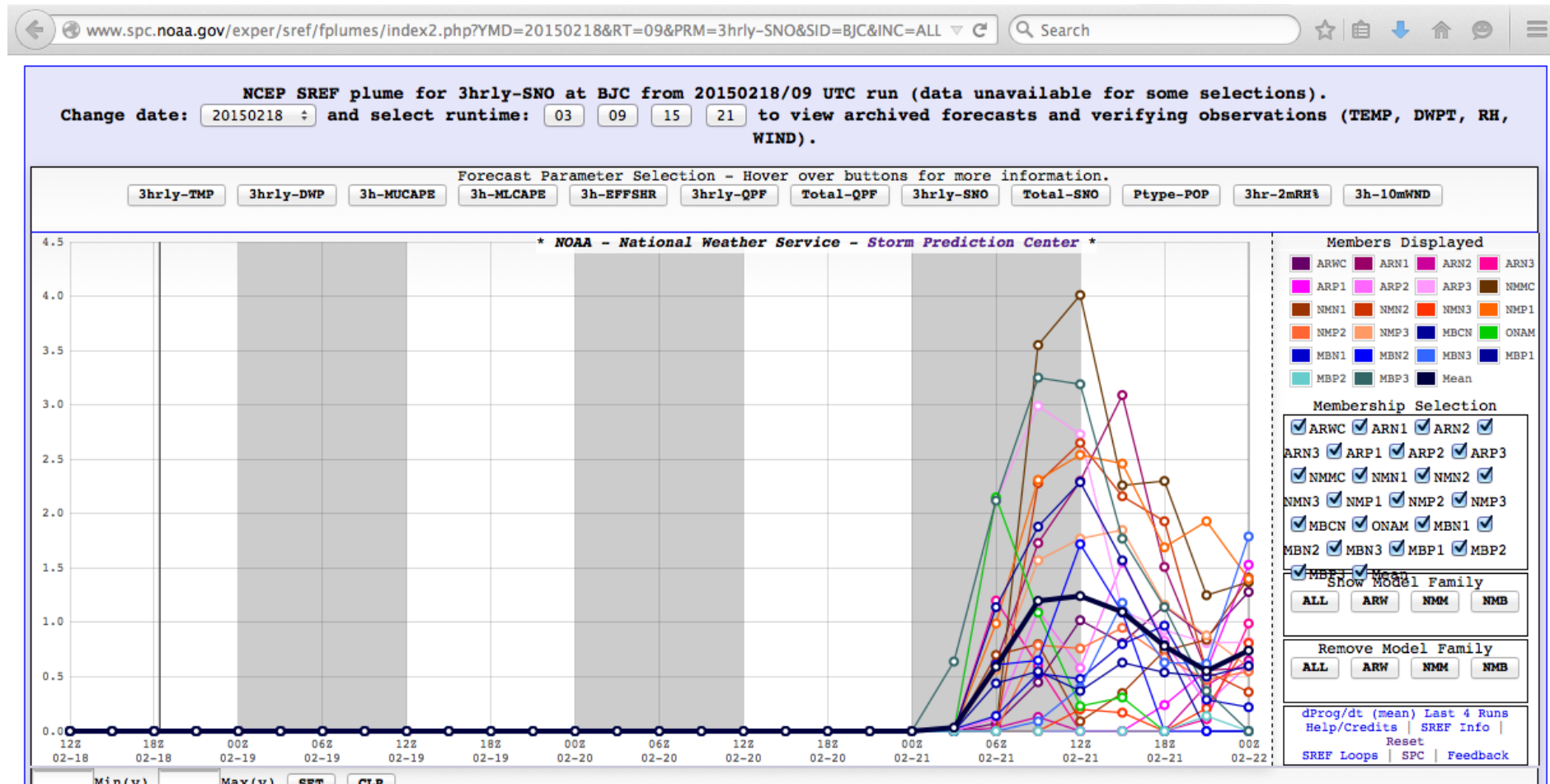
Aviation decision making—uncertainty

- Human-generated polygon of thunderstorms that could impact aviation
- Some information about type of storms (e.g., line, cluster, isolated storms), coverage, height of storms
- Still very hard to plan responses based on this information



Aviation decision making—uncertainty

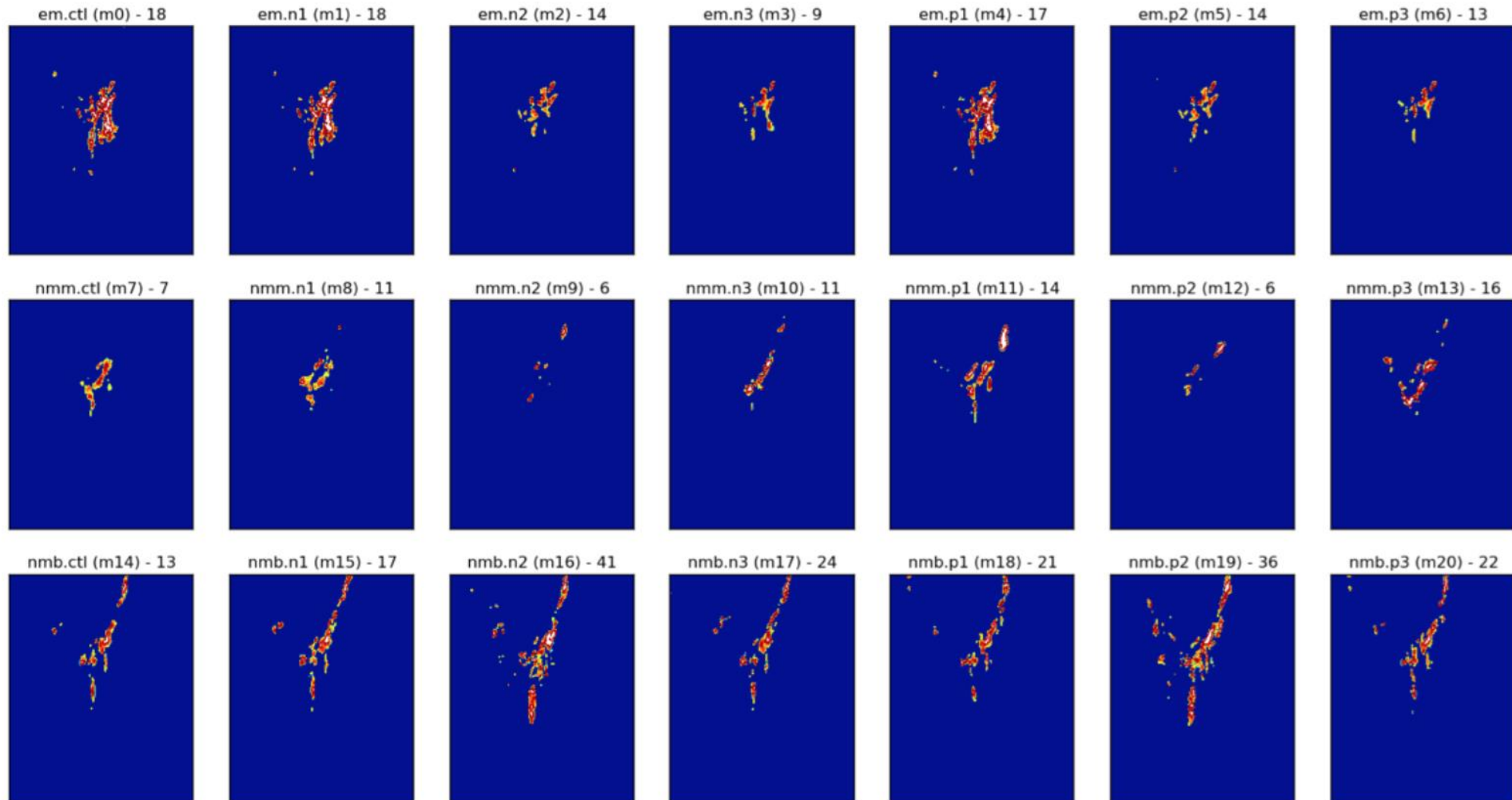
- Show full range of possibilities—can lead to data overload



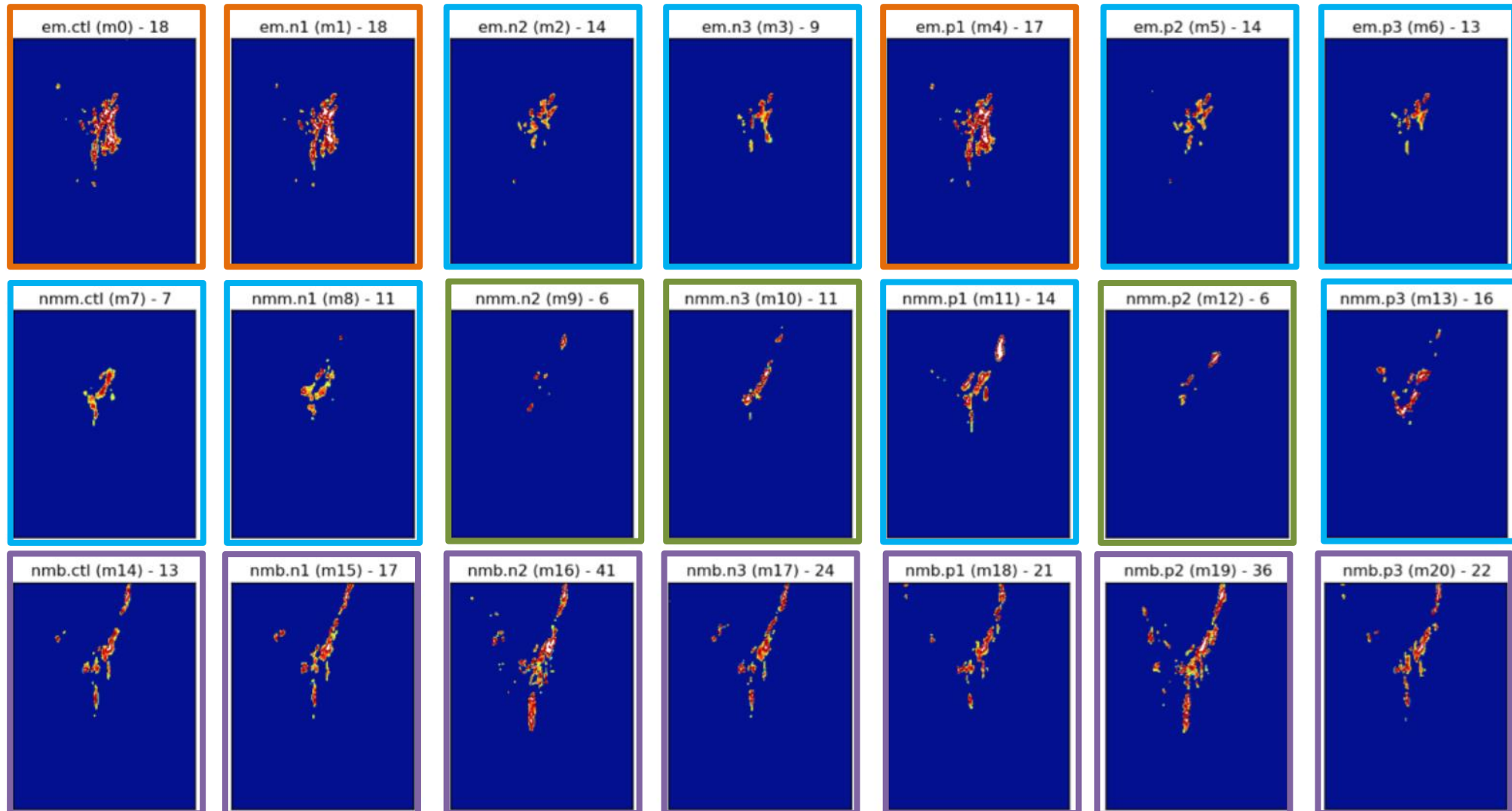
Aviation decision making—weather scenarios

- Take advantage of full range of solutions, but reduce the amount of data

Aviation decision making—weather scenarios

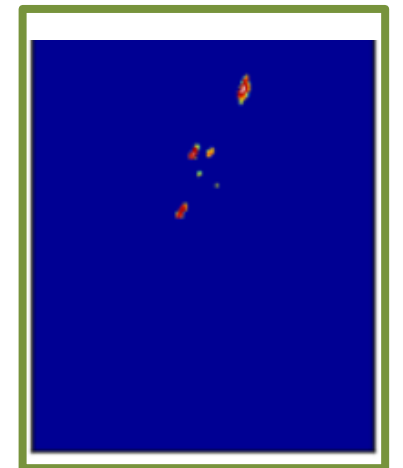
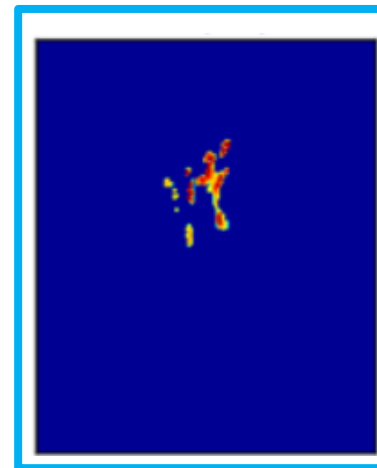
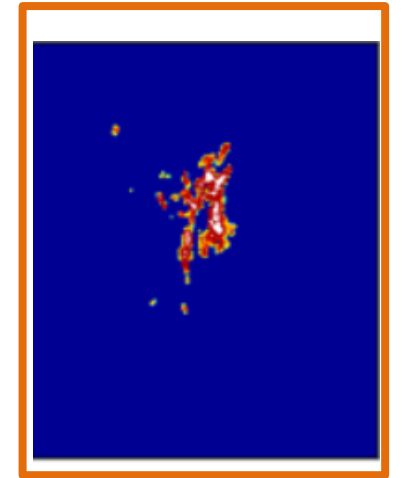
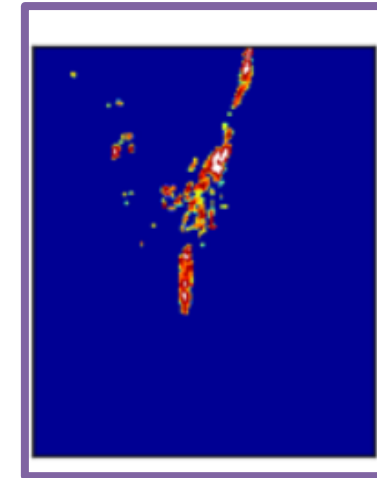


Aviation decision making—weather scenarios



Aviation decision making—weather scenarios

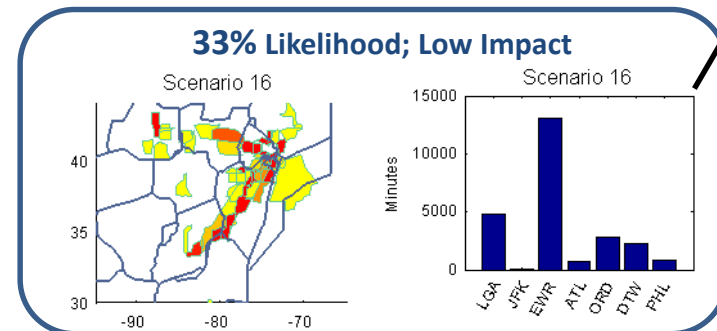
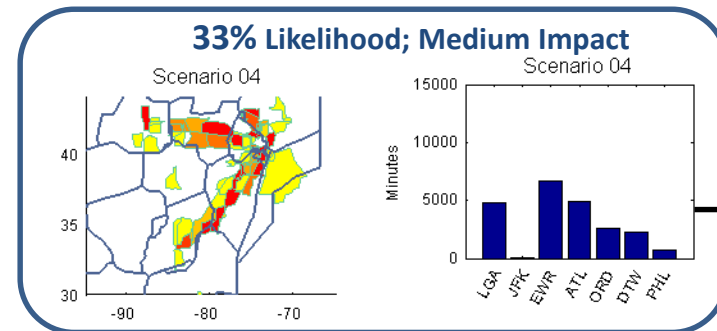
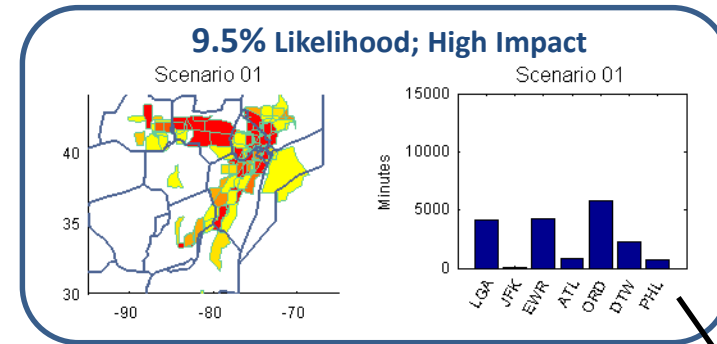
- 21 ensemble members have been reduced to 4 basic scenarios with very different expected responses
- Planners can select playbooks that are safe for any of the most likely scenarios



Aviation decision making—weather impact scenarios

Clustering on the weather gives different weather patterns

More useful would be to cluster on the impact, or on the optimum response, but this requires an accurate translation from weather to impact



Weather-caused delays by airport

Aviation decision making—constraint

Not all weather features are equally important

Focus should be on weather that impacts aviation interests

[U.S. Department of Commerce](#) | [National Oceanic & Atmospheric Administration](#) | [NOAA Research](#) | [National Weather Service](#)

INSITE

INtegrated Support for Impacted air-Traffic Environments

Auto Update ☐

Reference Time: 05/11/2017 2100

Echo Top: Products

Overview Constraint

[Alert Dashboard](#) [ARTCCs](#) [Help](#)

Valid Hour (UTC)

17 | 18 | 19 | 20 | 21 | 22 | 23 | 00 | 01 | 02 | 03 | 04 | 05 | 06 | 07 | 08 | 09

Washington (KZDC)



Fort Worth (KZFW)



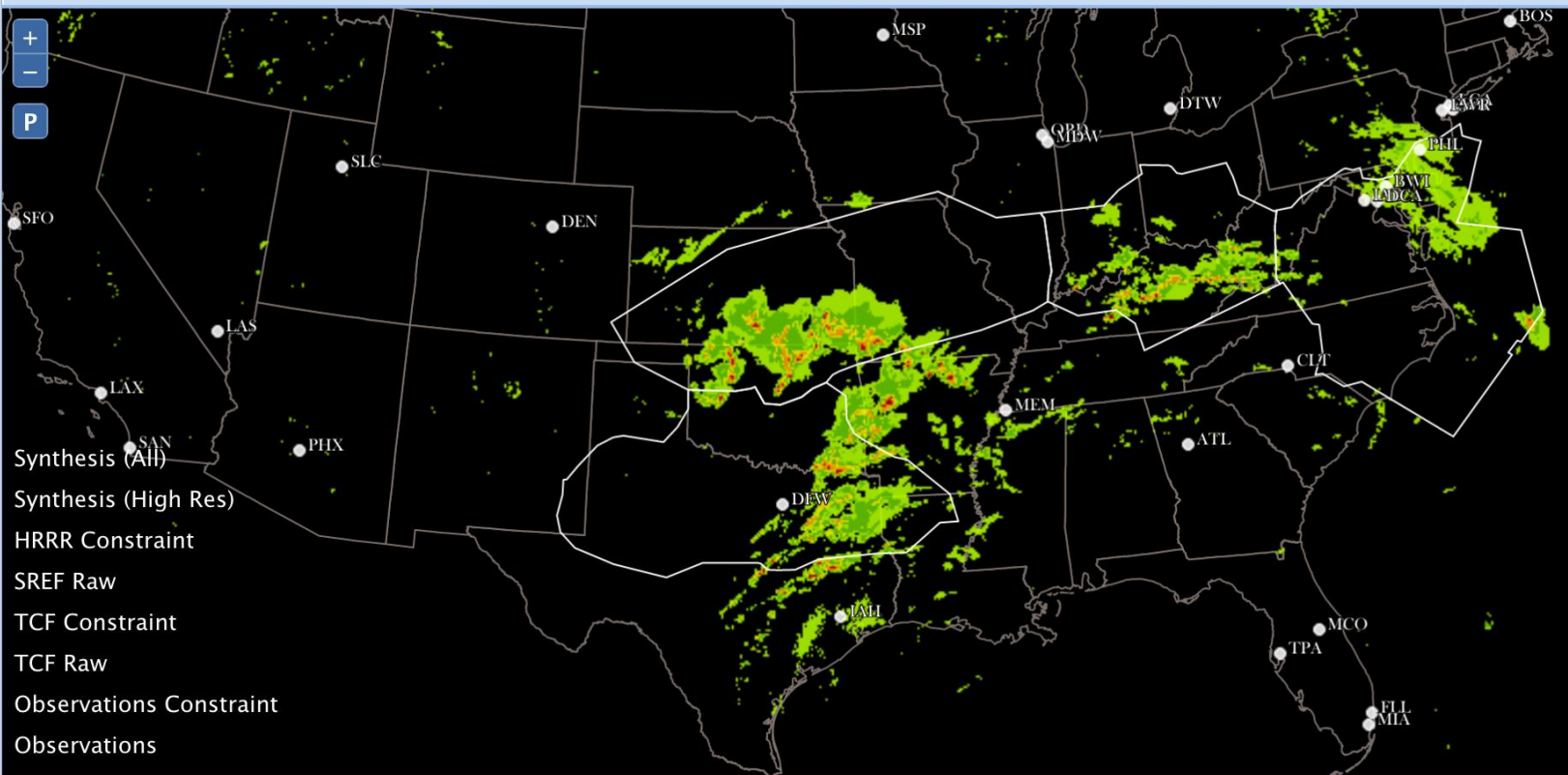
Indianapolis (KZID)



Kansas City (KZKC)



Observations 2017-05-11 2100 UTC Lead 0

Airway Overlays

☐ Primary ☐ Secondary ☐ Tertiary

Other Overlays

☒ Airport ☐ ARTCC

Product Navigation Placement

Left Side ☐ Right Side[User Guide](#)[Import/Export](#)[Reset](#)

INSITE



INtegrated Support for Impacted air-Traffic Environments




Echo Top:

Alert Dashboard ARTCCs Help

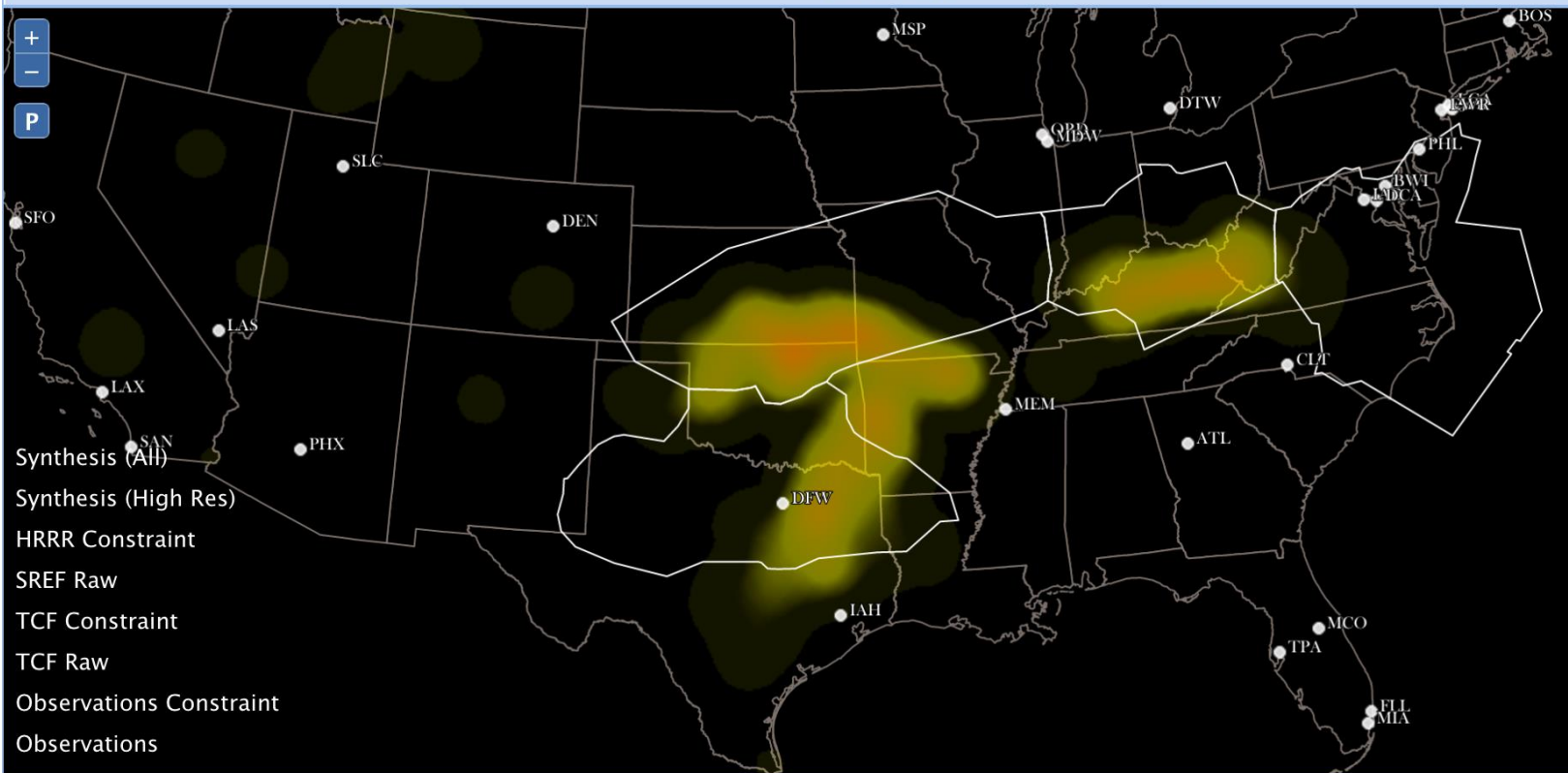
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Details

The diagram illustrates the structure of the data series. The top row, labeled 'FCST', consists of 12 periods. The first 5 periods are colored blue, green, yellow, yellow, and yellow, while the remaining 7 periods are light blue. The bottom row, labeled 'OBS', consists of 5 periods, all colored blue, green, yellow, yellow, and yellow, followed by 7 light blue periods.


Details[illegible]

⏪
⏩
⏮
Historical Traffic
▼
Local Normalized
▼
Legend



User Guide Import/Export Reset

Left Side Right Side

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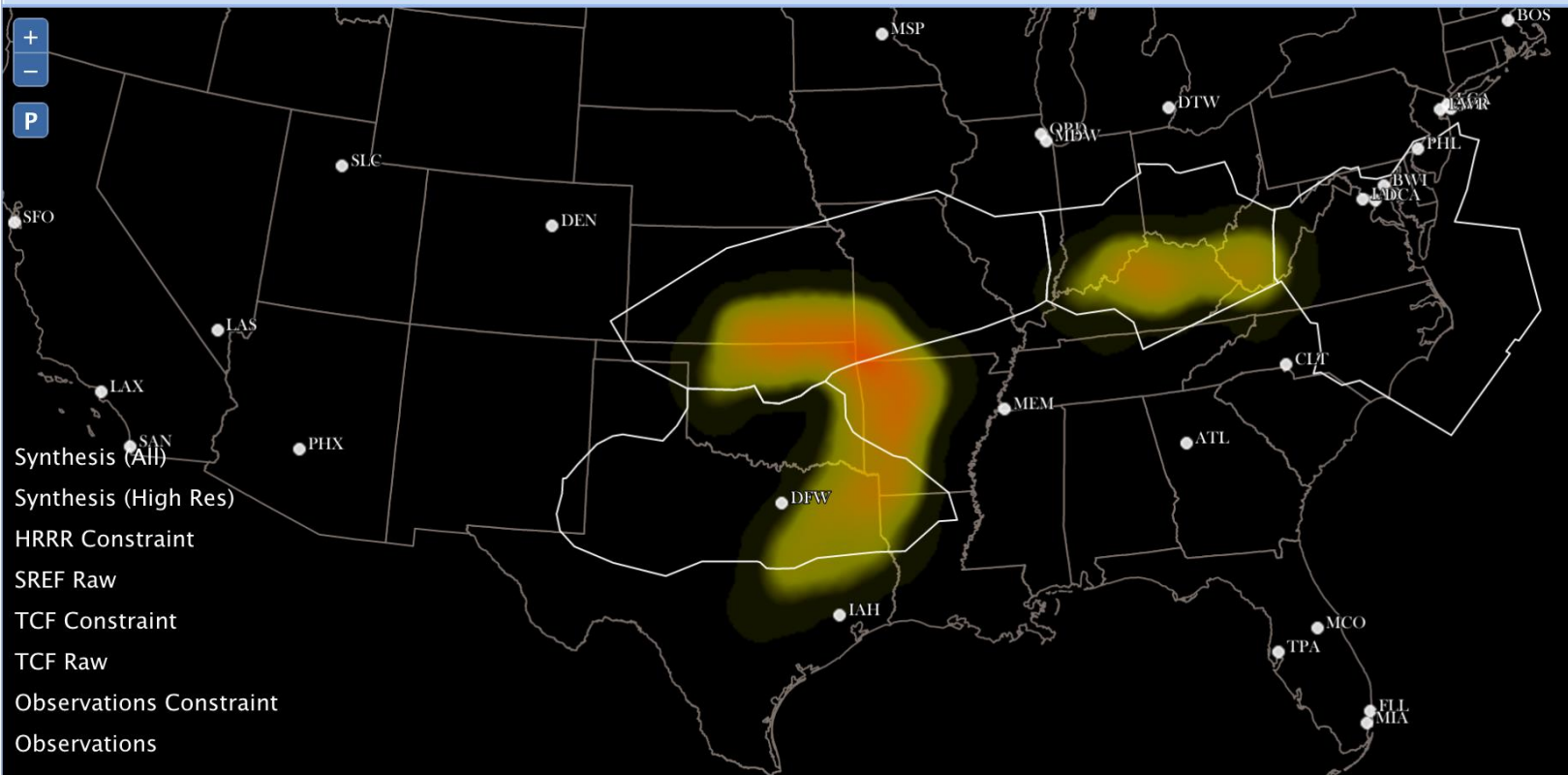
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Kansas City (KZKC)



Synthesis (All) 2017-05-11 2100 UTC Lead 0

Synthesis (All)
Synthesis (High Res)
HRRR Constraint
SREF Raw
TCF Constraint
TCF Raw
Observations Constraint
Observations

Airway Overlays

☐ Primary ☐ Secondary ☐ Tertiary

Other Overlays

☒ Airport ☐ ARTCC

Product Navigation Placement

Left Side ☐ Right Side[User Guide](#)[Import/Export](#)[Reset](#)

Summary

- Uncertainty in weather forecasts is generally achieved through either statistical (climatology) or dynamic (ensemble) approaches
- Uncertainty can be generic
 - Overall historic performance of model (statistical)
 - Basic probabilities of weather phenomena (dynamic)
- Or specific
 - Performance of model when the atmosphere was similar to today (statistical)
 - Likelihood of particular weather scenarios (dynamic)
- More helpful than simple weather uncertainty, weather can be translated into impact to provide information tailored to users
 - Thunderstorms → Air traffic flow constraint
 - Temperature, humidity → Electricity demand