

# Algorithms to Track the Migration of Birds Along the US East Coast

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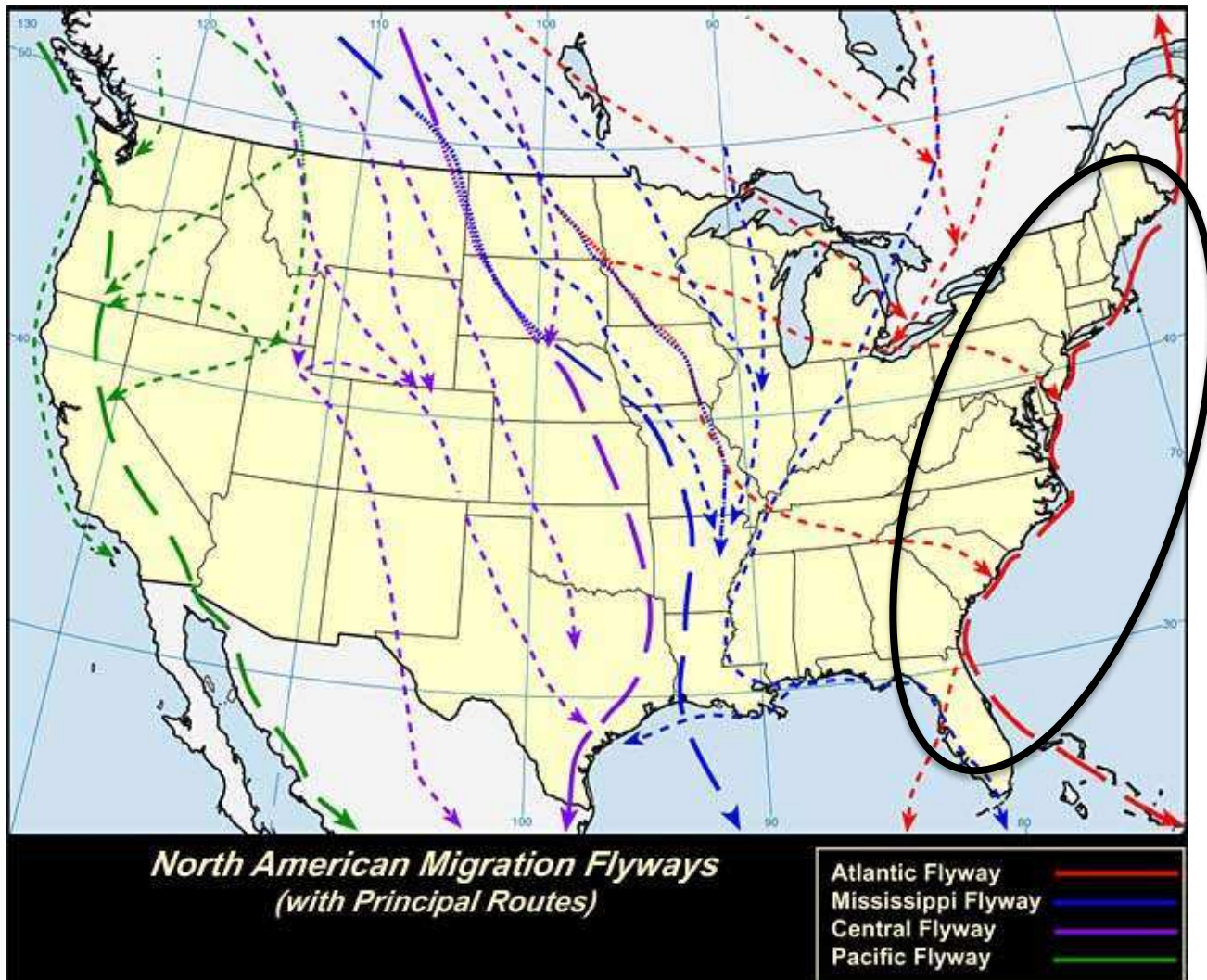


# Presentation Outline

- Present the motivation for the study
- Provide an overview of the radar mosaicking method
- Discuss the algorithm
- Show results from the analysis
- Summary & Conclusions

# Motivation of the Study

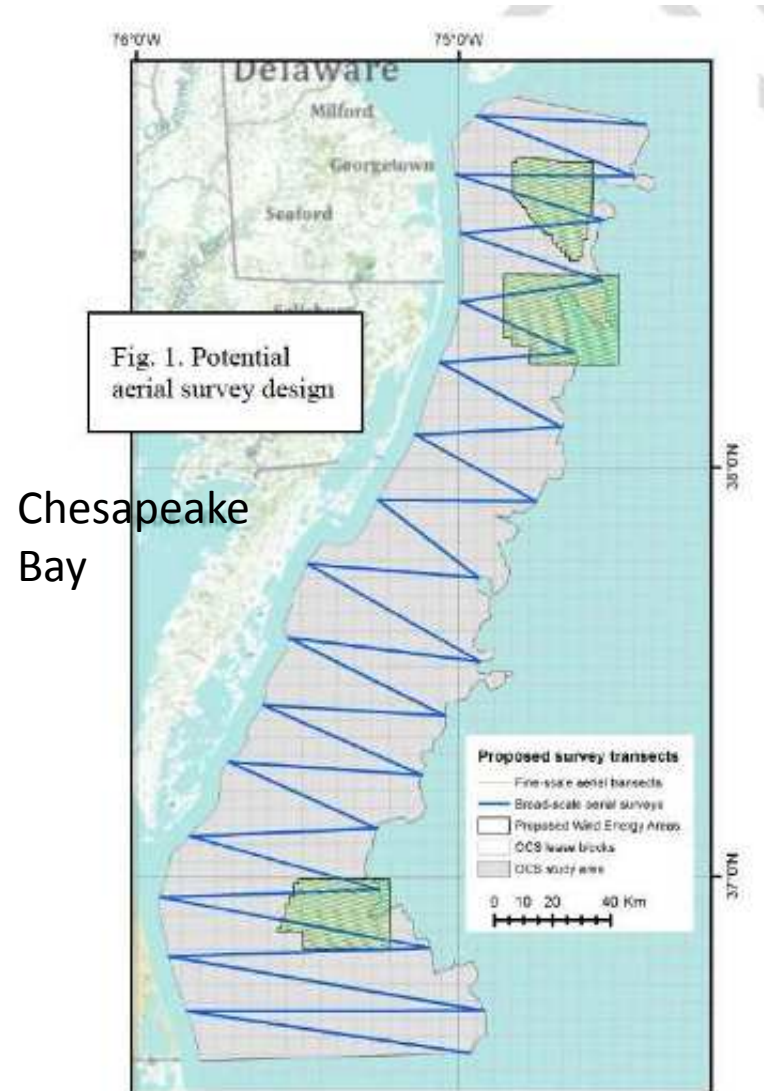
# Migratory Flyways in the US



# Offshore Wind Farm Assessment Study

## Funded by the US Dept. of Energy

- Study the density and movement of wildlife across spatial and temporal scales on the mid-Atlantic outer continental shelf
- Various ground based and modeling approaches to be used in the study, but here we only consider the use of operational weather radar
- Shown to the right is the study region being considered (expanded view provided on next slide)





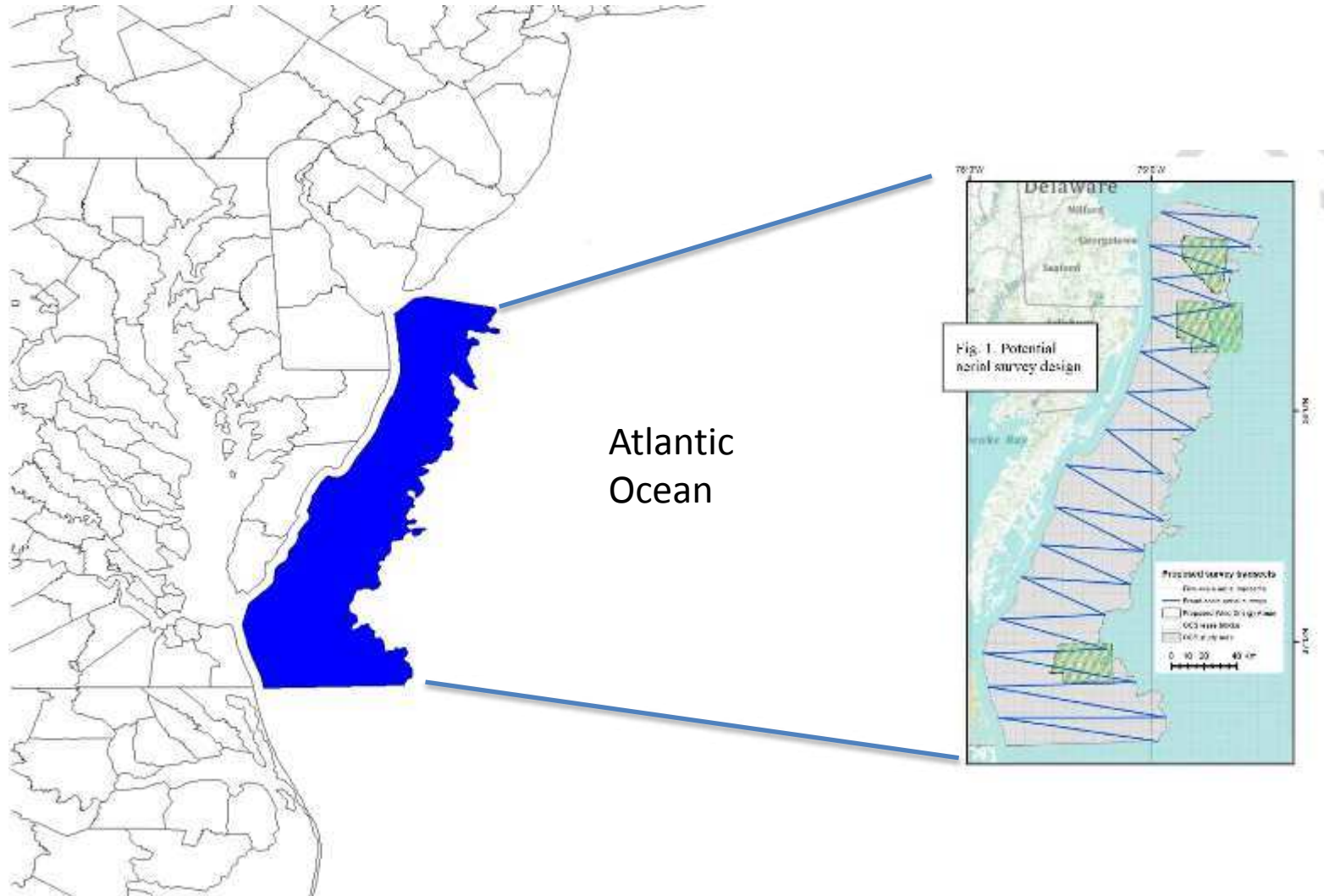
# Offshore Wind Farm Assessment Study Funded by the US Dept. of Energy



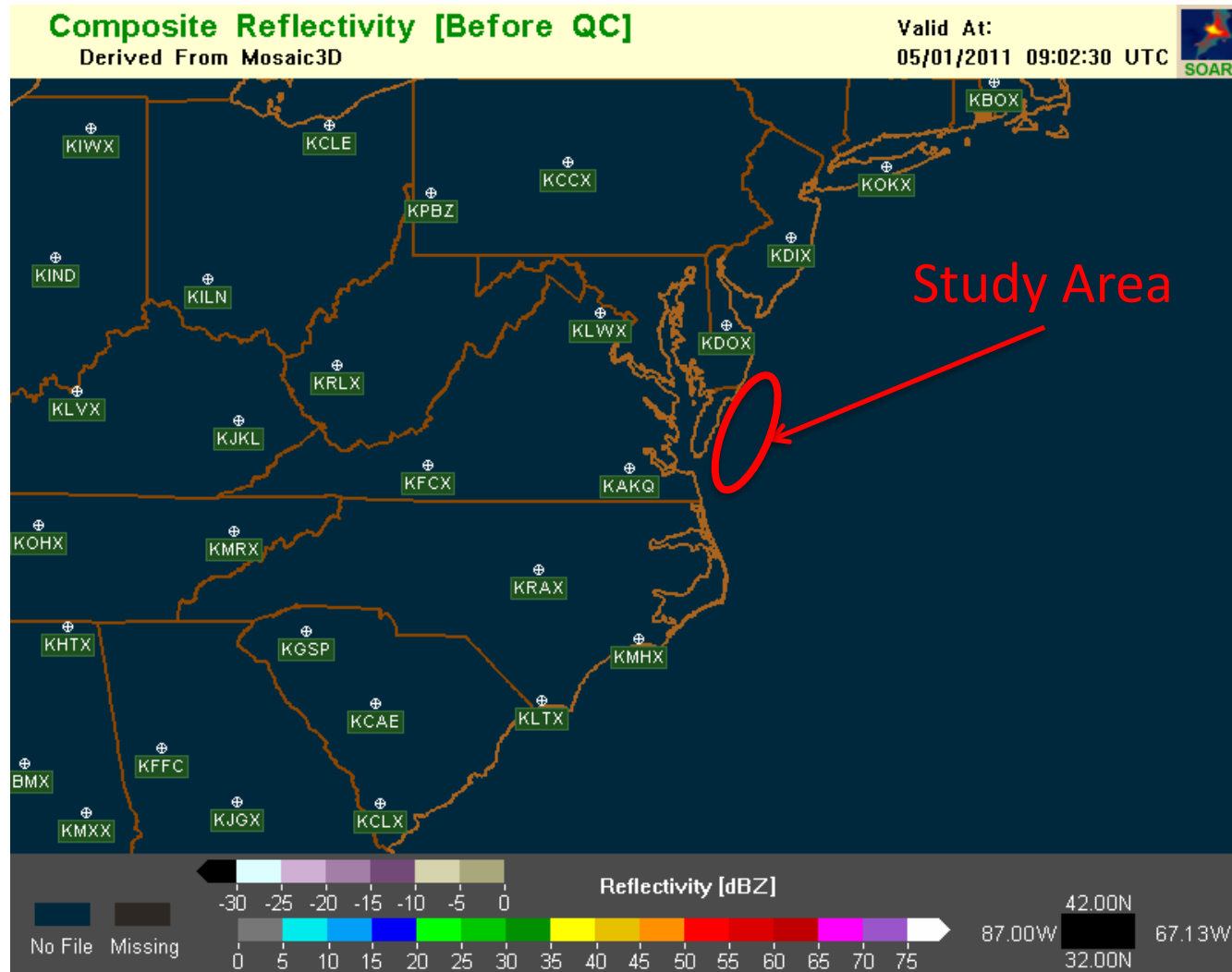
Study Area

# Offshore Wind Farm Assessment Study

## Funded by the US Dept. of Energy



# The Use of Radar to Study the Offshore Area



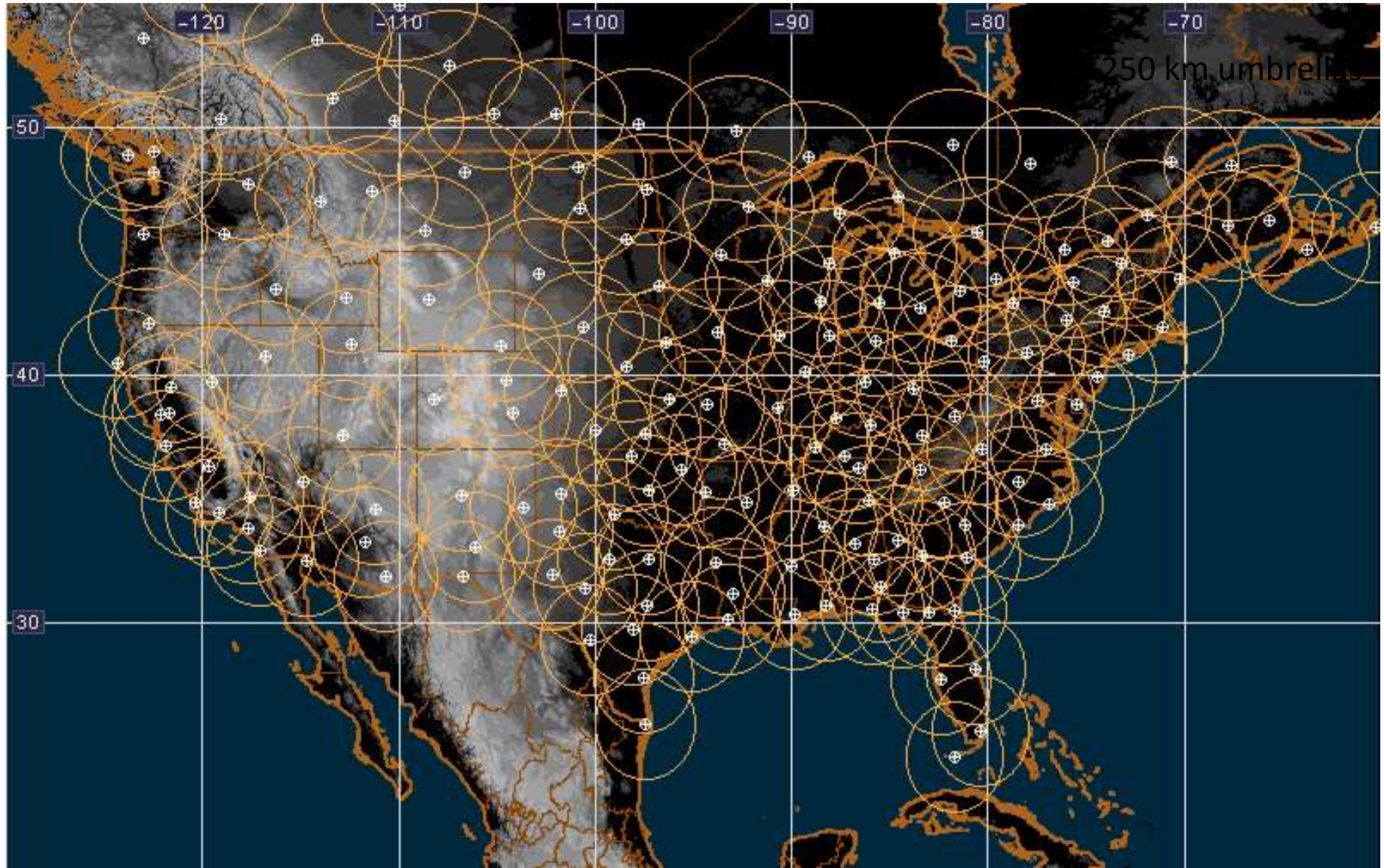


# Motivation: Overview

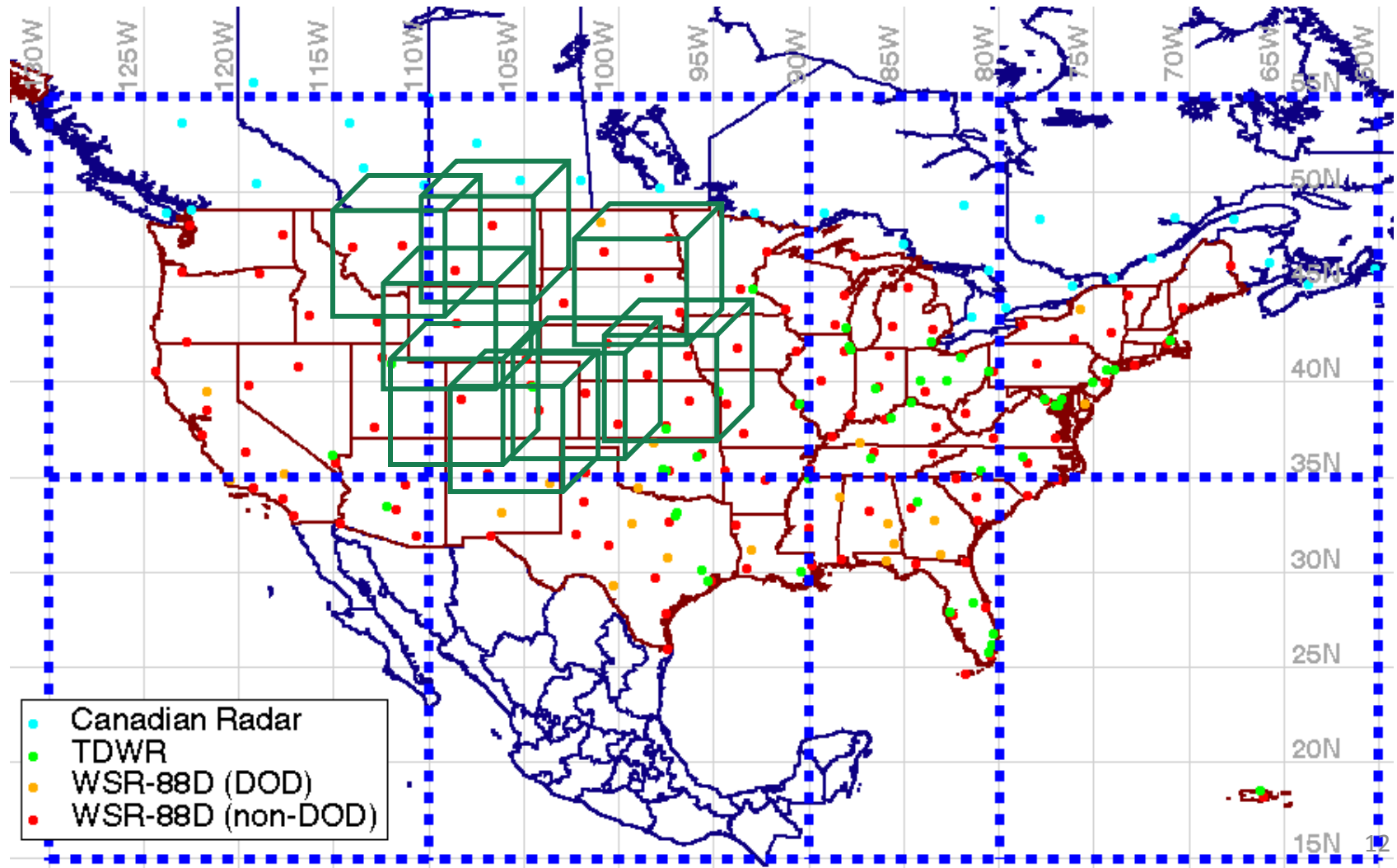
- The overall task is to assess the potential impact of offshore wind farms located off the east coast of the US (near the Chesapeake Bay) on birds
- Part of the analysis includes the use of data from NEXRAD (network of S-band weather radars operated by the US weather service)

# Radar Mosaicking

# US NEXRAD & Canadian Radar Networks



# 3-D CONUS Radar Mosaic





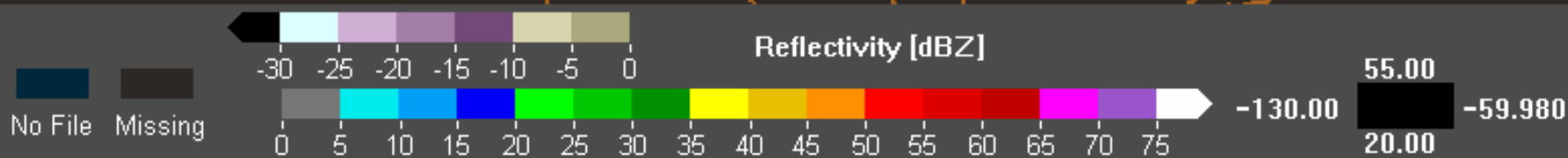
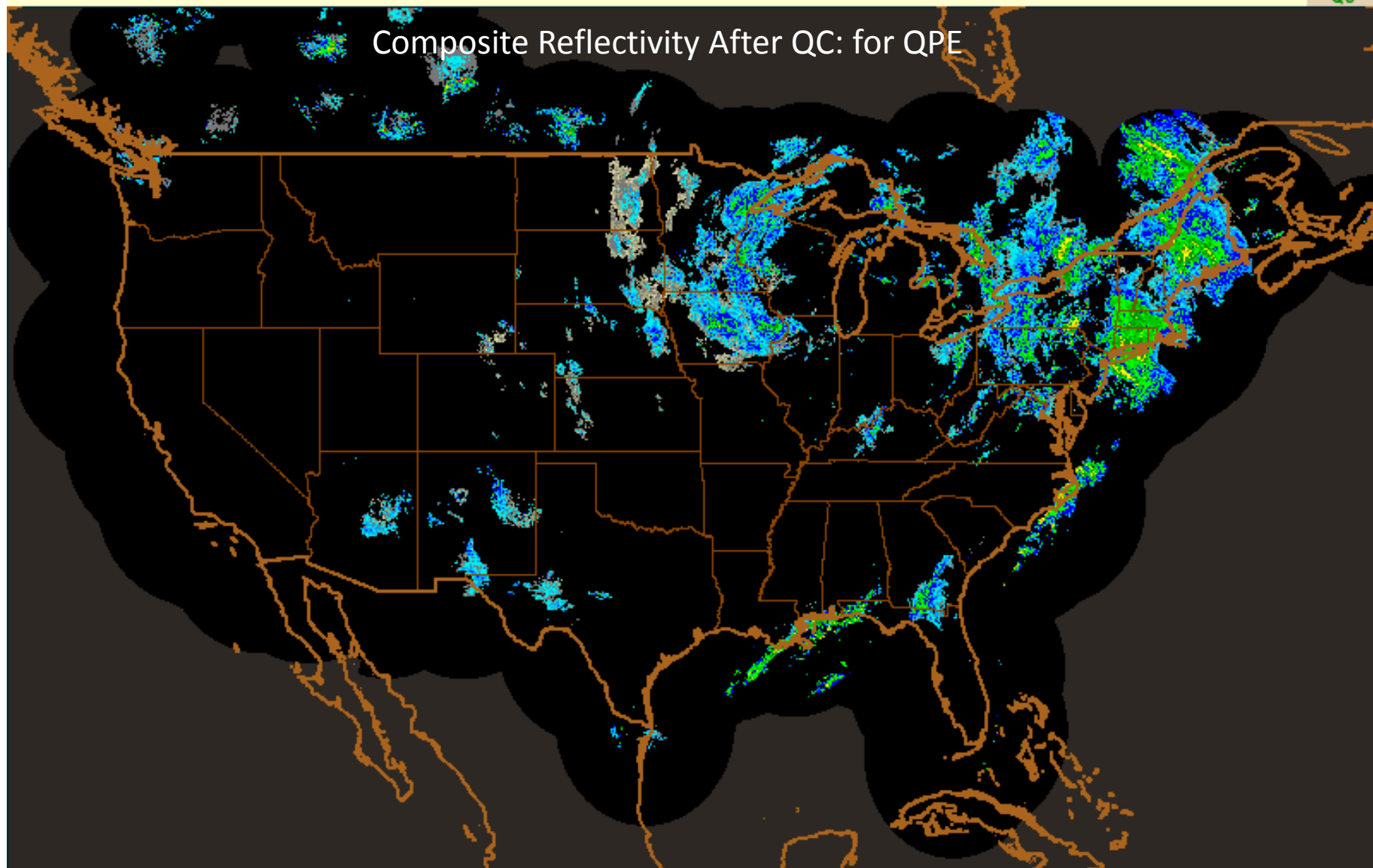
# Composite Reflectivity

Derived From Mosaic3D

Valid: 05/01/2014 06:00:00 UTC

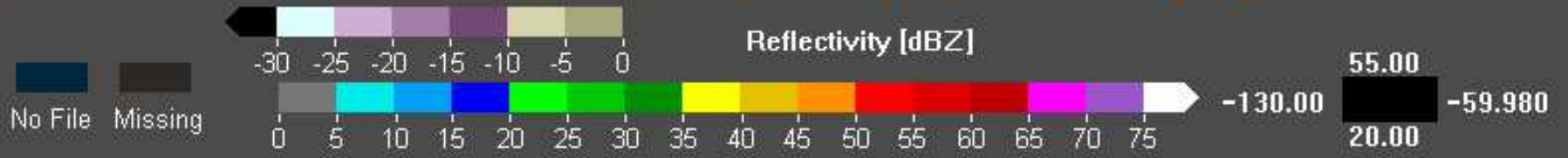
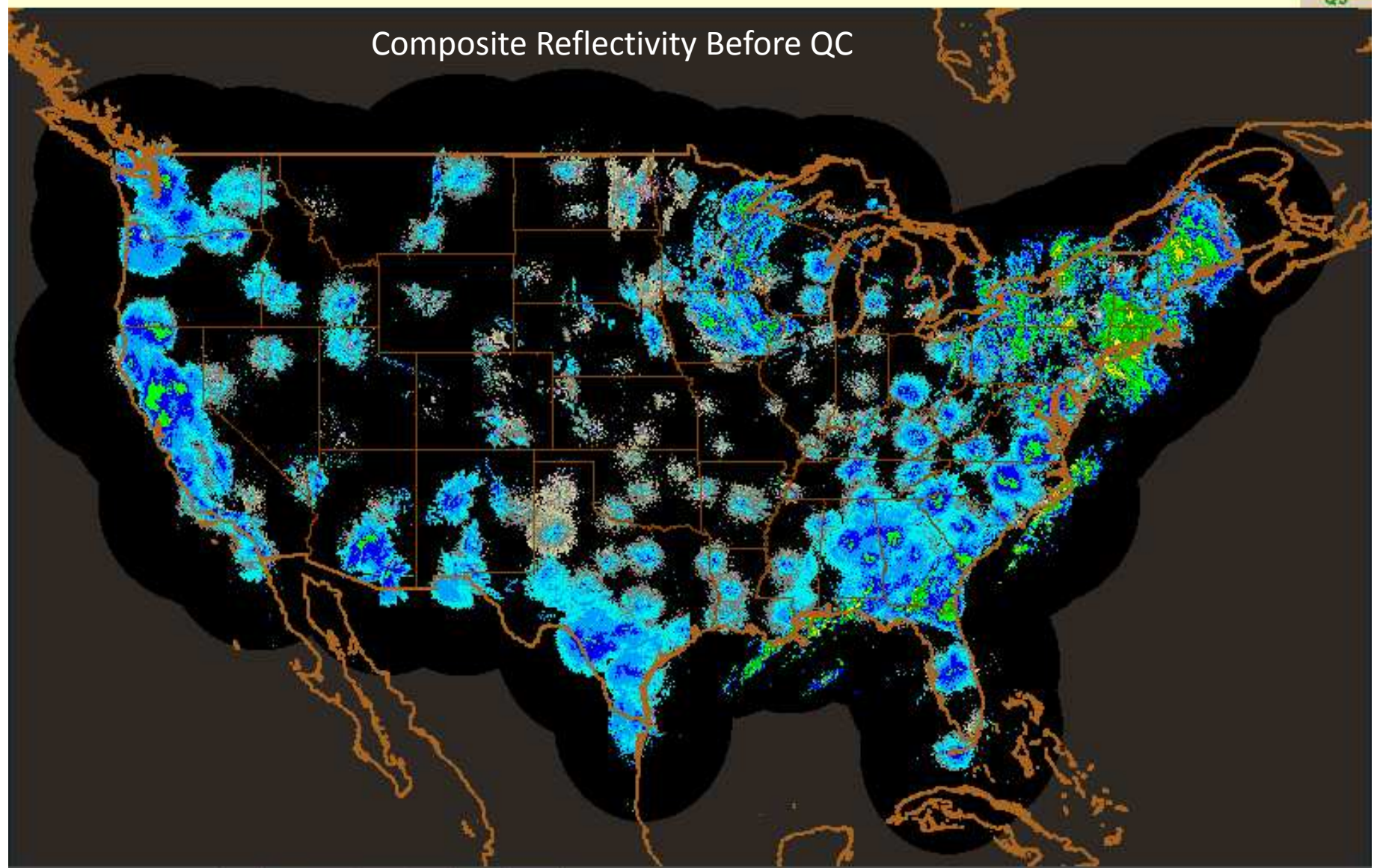


## Composite Reflectivity After QC: for QPE





### Composite Reflectivity Before QC





# Composite Reflectivity (CREF) Data Raster

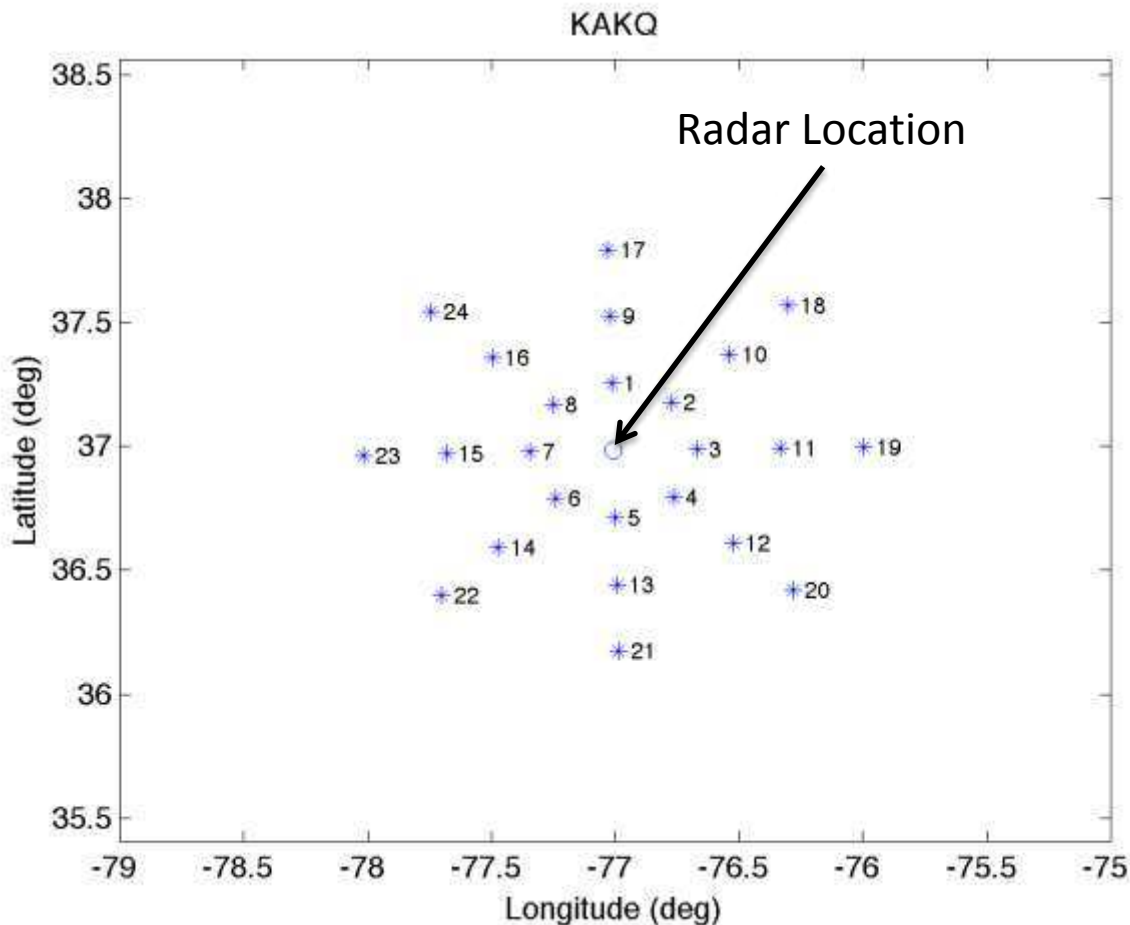
- **CREF** data for the Continental US (CONUS) have typically had spatial and temporal resolutions of  $0.01^\circ \times 0.01^\circ$  (approximately  $1 \text{ km}^2$ ) and 5 min, respectively – but this is changing.
- CREF data have been quality controlled (QC'ed) to remove non-meteorological signals.
- CREF data before QC are also available (**UNQC\_CREF**)
- The UNQC\_CREF data contain biological scatter (bioscatter) but also clutter, sunspikes, chaff echoes, radio interference, and such

# Radar Mosaicking: Overview

- Data from NEXRAD, some terminal Doppler weather radars (TDWR), and some Canadian weather radars are merged to form contiguous 3-D representations of atmospheric phenomena
- Two products of the processing are CREF and UNQC\_CREF, which are 2-D projections of the radar signal strength (composite reflectivity) onto the surface.
- CREF and UNQC\_CREF data available as a GeoTIFF raster
- Each pixel in the raster covers 1 km<sup>2</sup> (1 km x 1 km)
- A new raster is available every 5 minutes

# Algorithm Development

# Create Rings of Points Around a Particular Radar Site



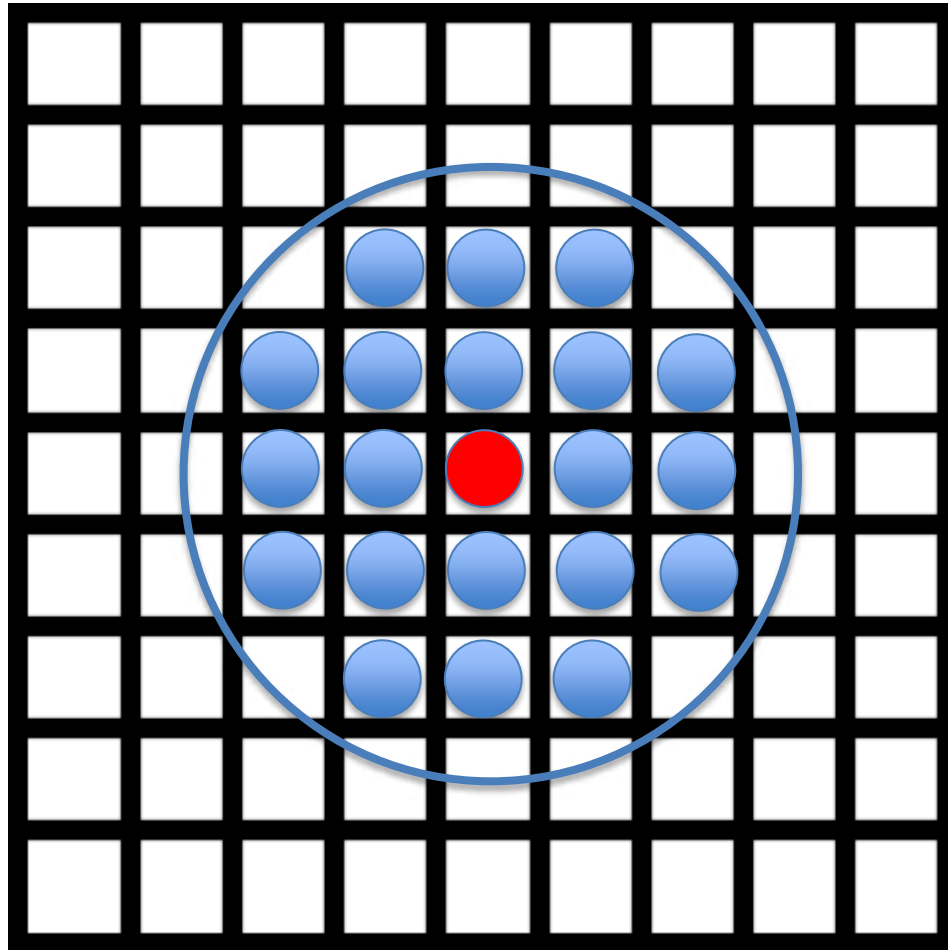
Rings located at distances of 30, 60, and 90 km from the radar site

Each ring contains 8 points

Bounding box used by GRASS (GIS software) to define a region within the from the composite reflectivity raster

For each point, a prescribed number of pixels from the raster are examined

# Assigning CREF Pixels From the Raster

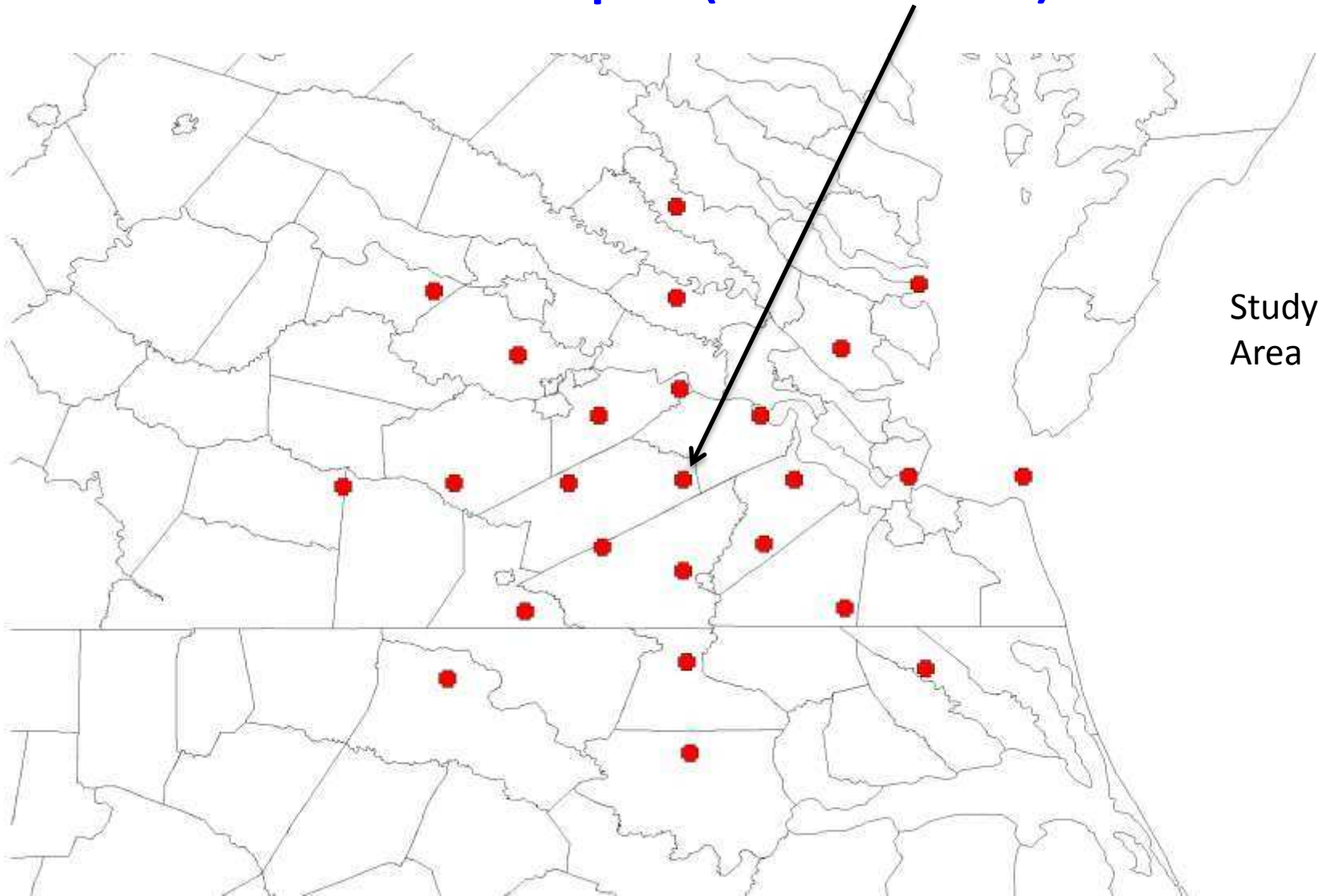


Find the pixel in the raster of the CREF and UNQC\_CREF data corresponding to a particular point on the ring (shown here as a red 'dot').

Use GRASS to "grow" the area around the point

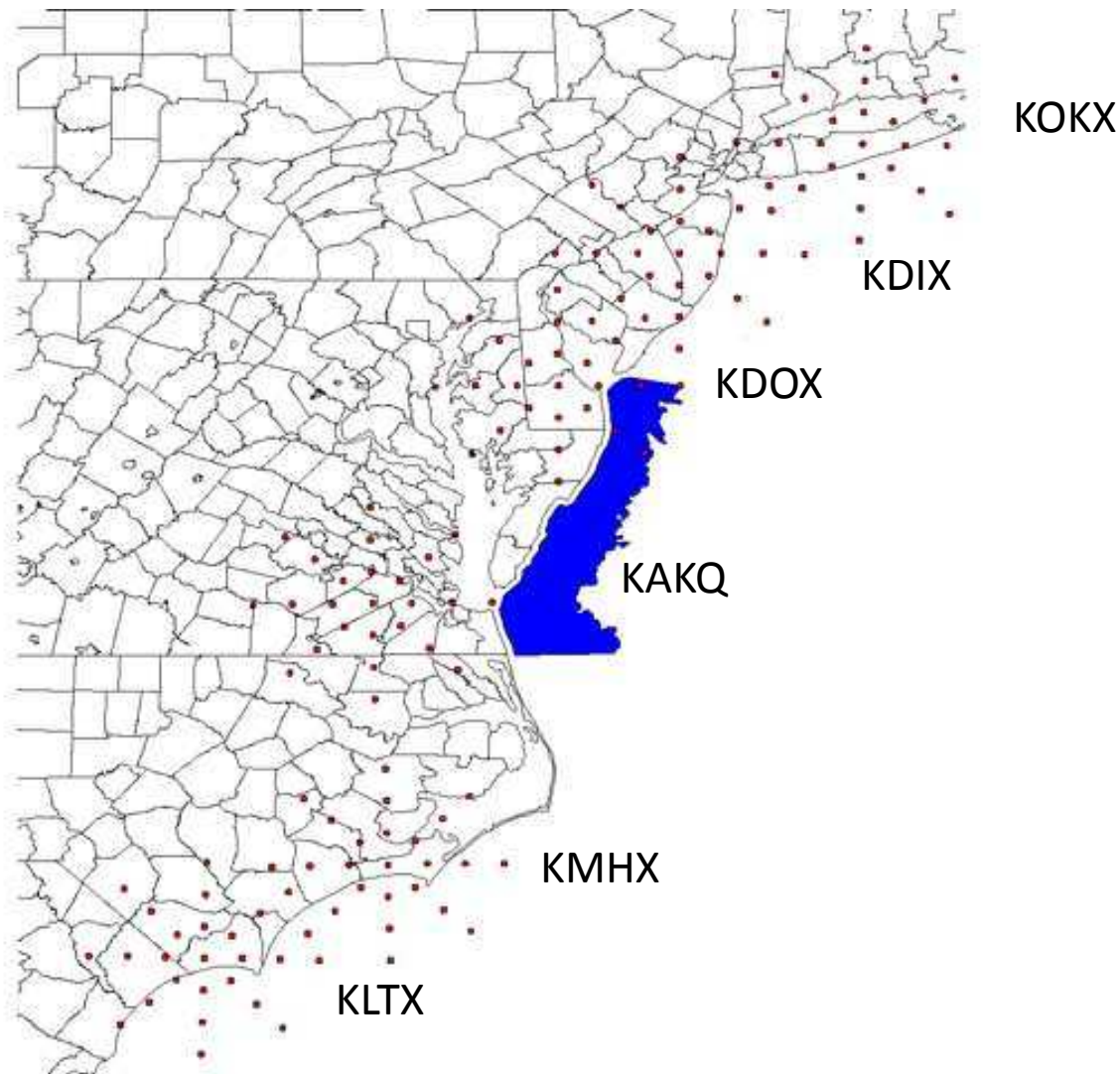
Use the resulting pixels (here 21) in the raster for a univariate analysis of the reflectivity values

# Rings and Points Projected onto the Landscape (for KAKQ)





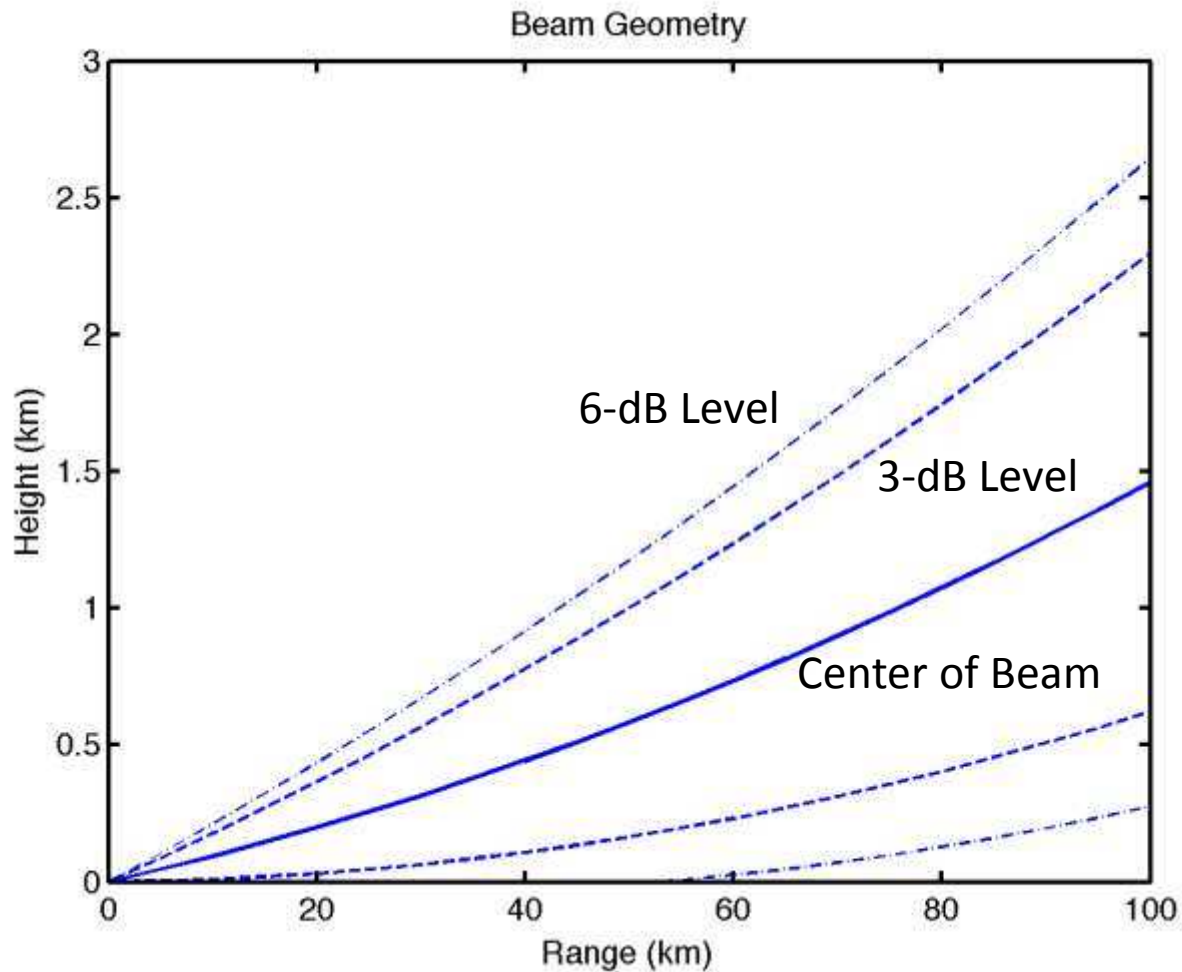
# Location of the 144 NEXRAD Radar Data Collection Points



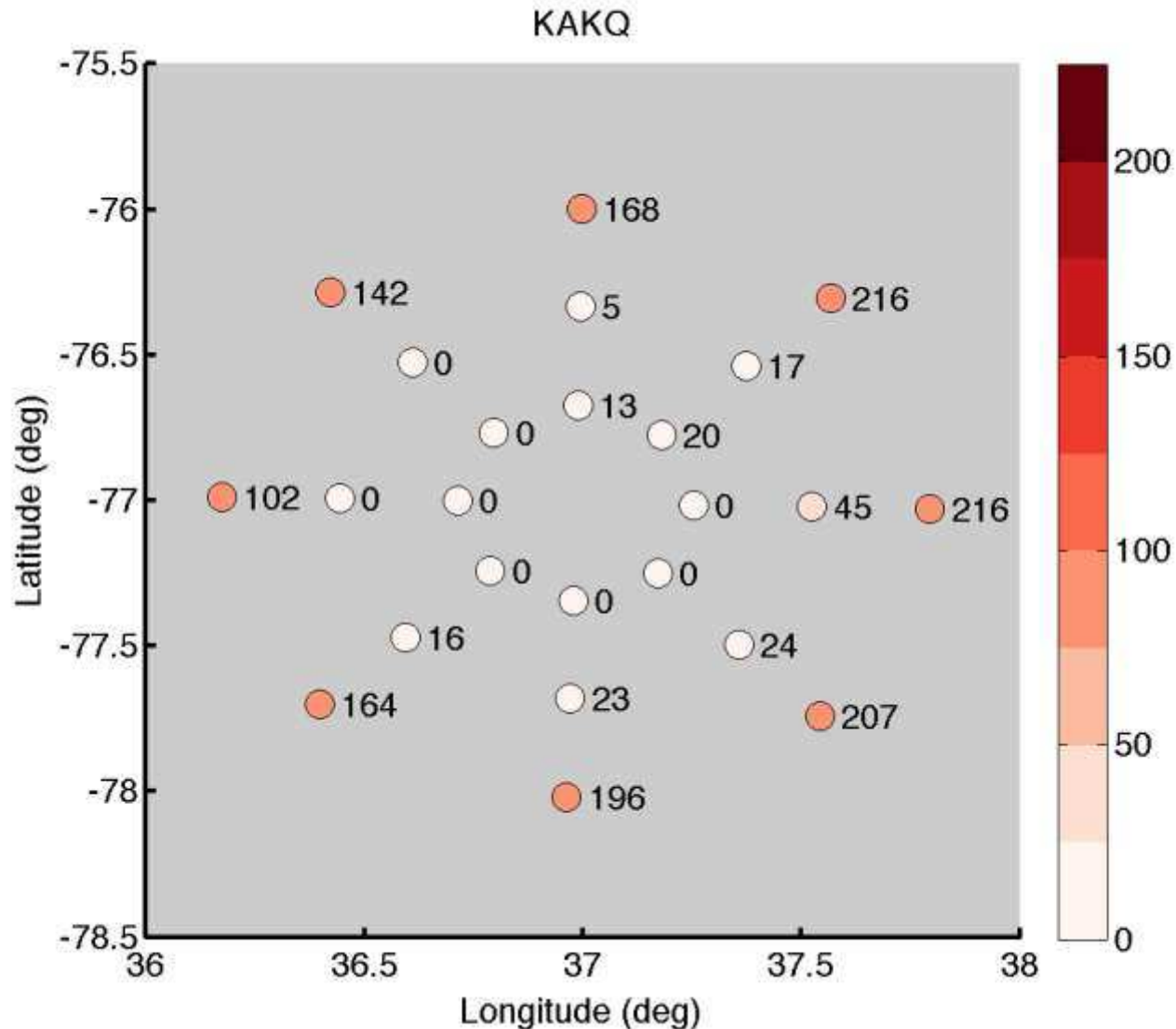
# Preliminary Data Analysis

- Perform a univariate analysis on the collection of 21 reflectivity values for each of the 144 (6 radars x 24 points) clusters for both the CREF and UNQC\_CREF data
- Results of the **univariate analysis** (sum, mean, max, min, standard deviation, number of pixels used) are saved
- A filtered version of the UNQC\_CREF data is created by discarding those values for which there is a corresponding signal in the CREF data – that is only data with no “weather contamination” are considered

# Height Coverage of Lowest Beam Assuming Flat Terrain (4/3 Earth Model)



# Radar Height Coverage Taking Terrain Into Consideration



# Algorithm Development: Overview

- We examine 144 locations, each corresponding to an area of 21 km<sup>2</sup>) located across the eastern US
- CREF and UNQC\_CREF data for these regions are evaluated using univariate analysis
- Statistics from the univariate analysis for filtered (only using times when no weather is present) UNQC\_CREF data are investigated
- Height coverage is taken into consideration based on distance from the radar site and topography

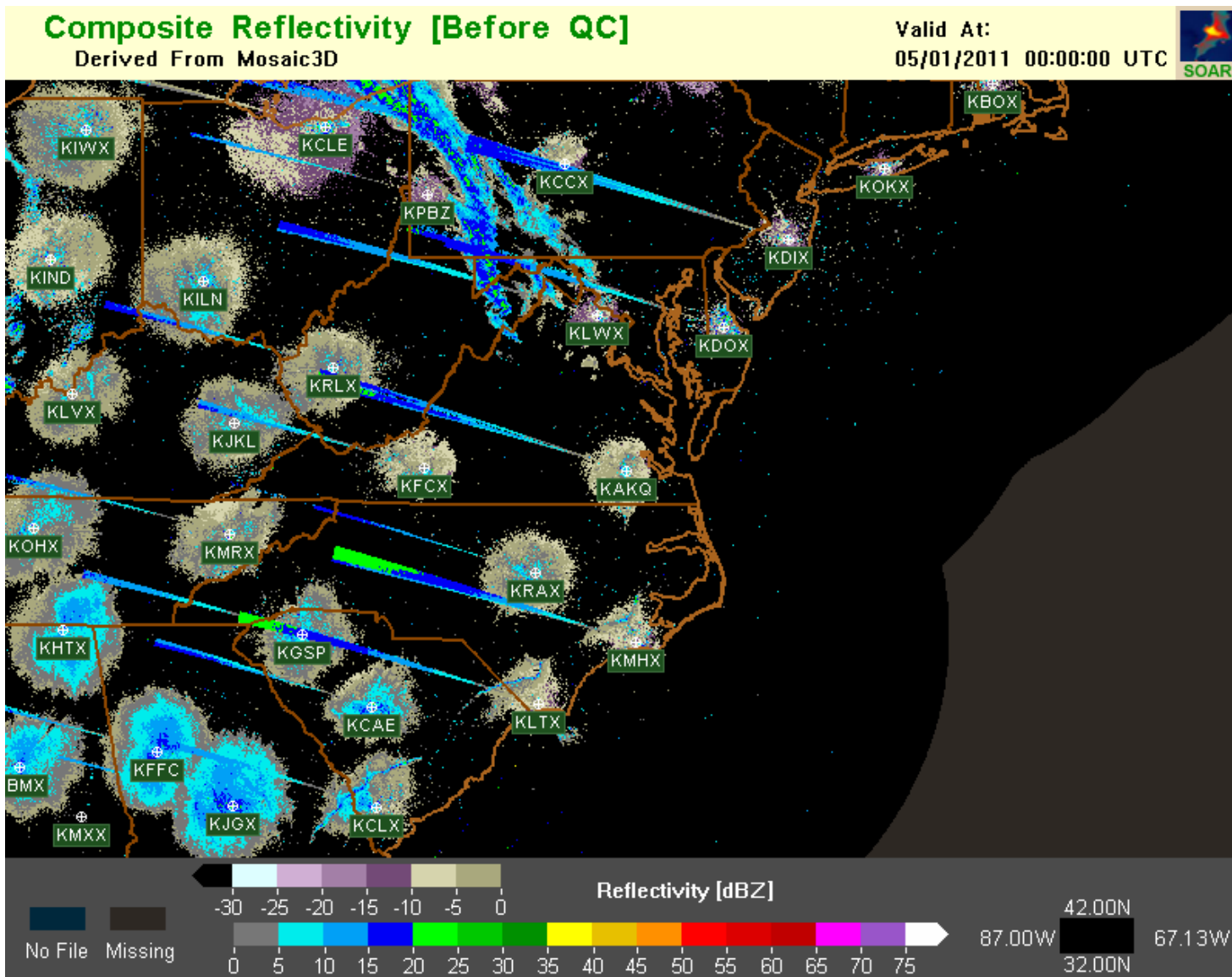
# Results



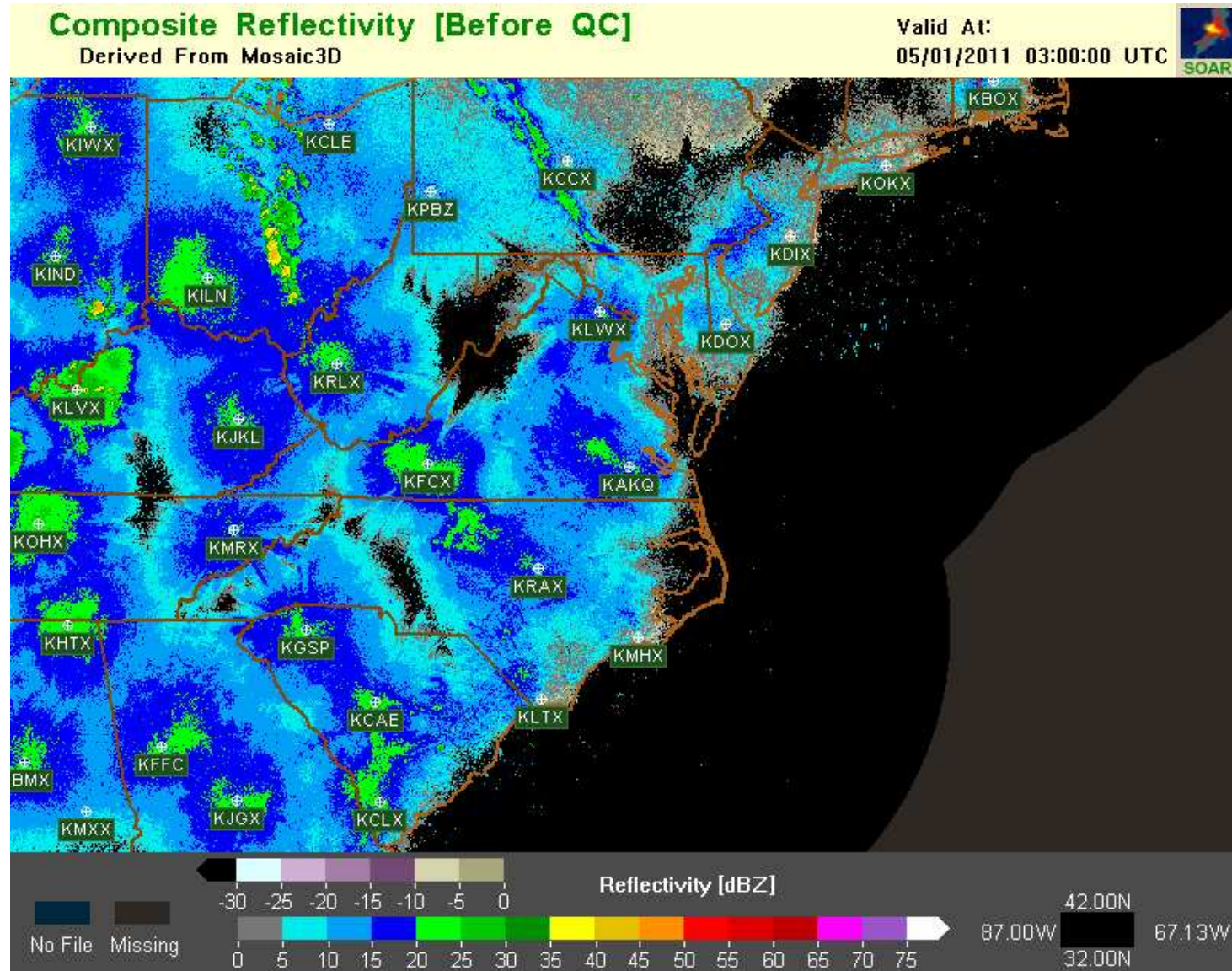
# Periods of Investigation

- We are focusing on the months of May (spring migration) and September & October (fall migration) over several years
- Moreover, we are focusing on the periods during the day corresponding to
  - Local sunset  $\pm 1$  hour
  - Local sunrise  $\pm 1$  hour
  - Local midnight (midpoint between sunset and sunrise)  $\pm 3$  hours
- Local sunset and sunrise are calculated for each radar domain and for each day using the convention of civil twilight (sun is located  $6^\circ$  below the horizon)

# 01 May at 00 UTC

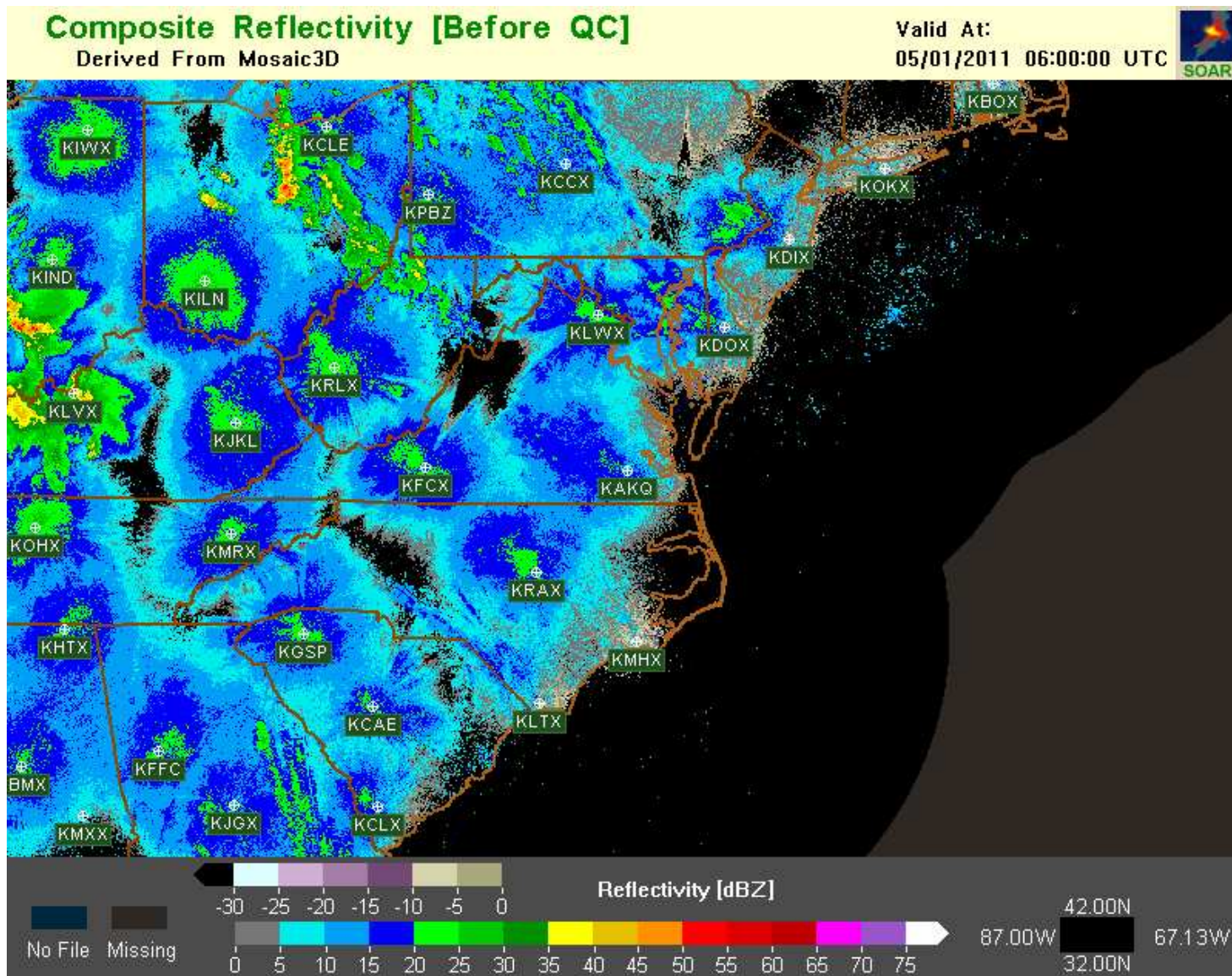


# 01 May at 03 UTC





# 01 May at 06 UTC



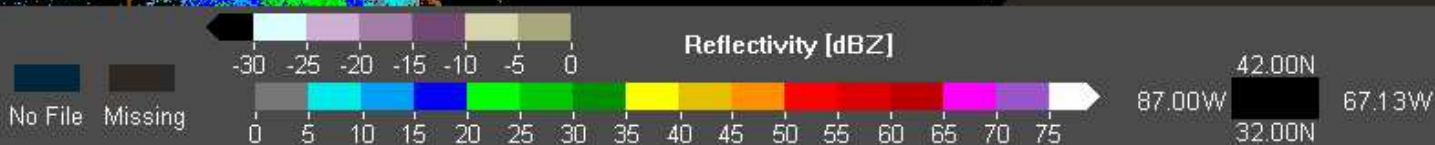
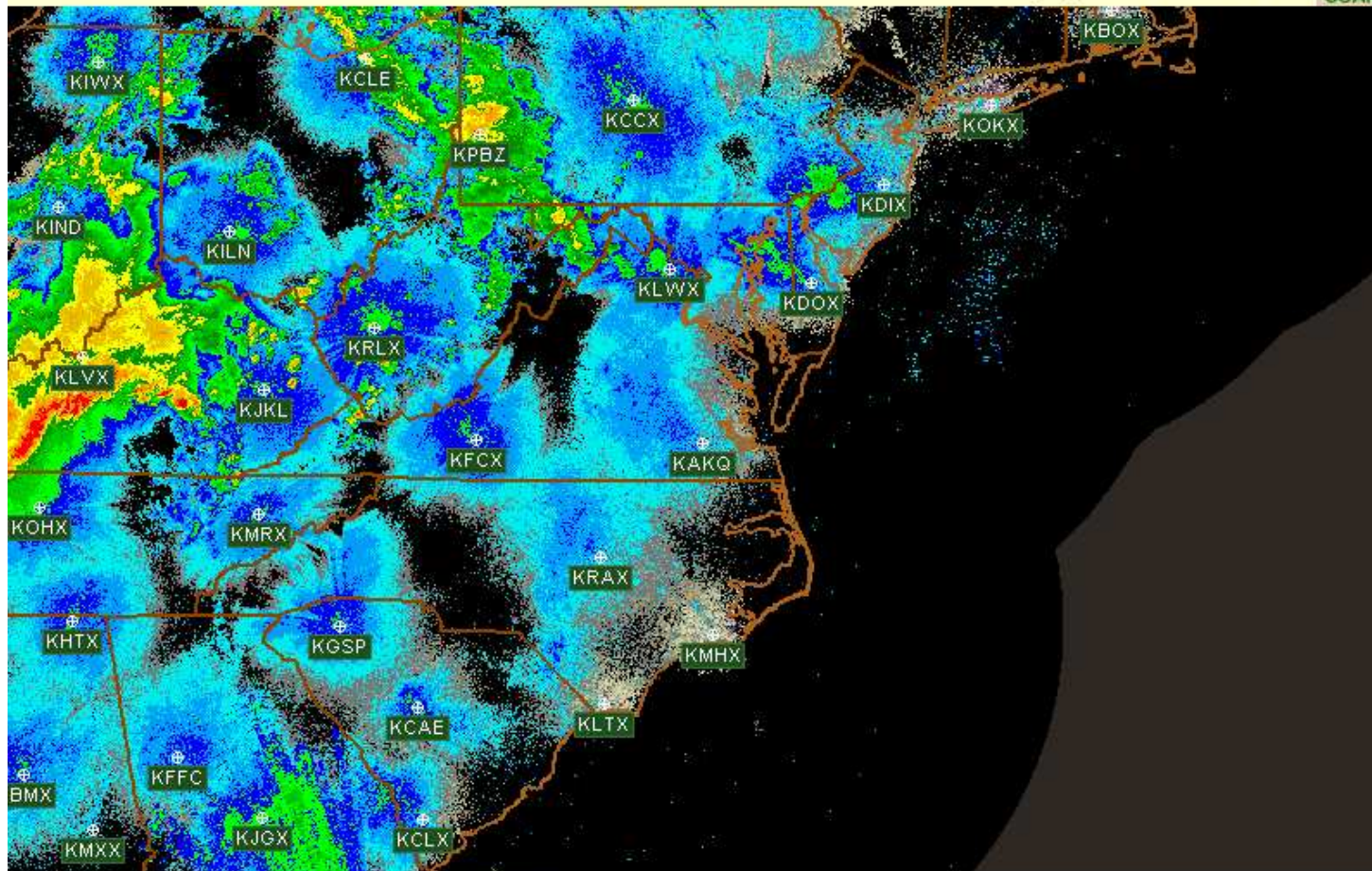
# 01 May at 09 UTC

## Composite Reflectivity [Before QC]

Derived From Mosaic3D

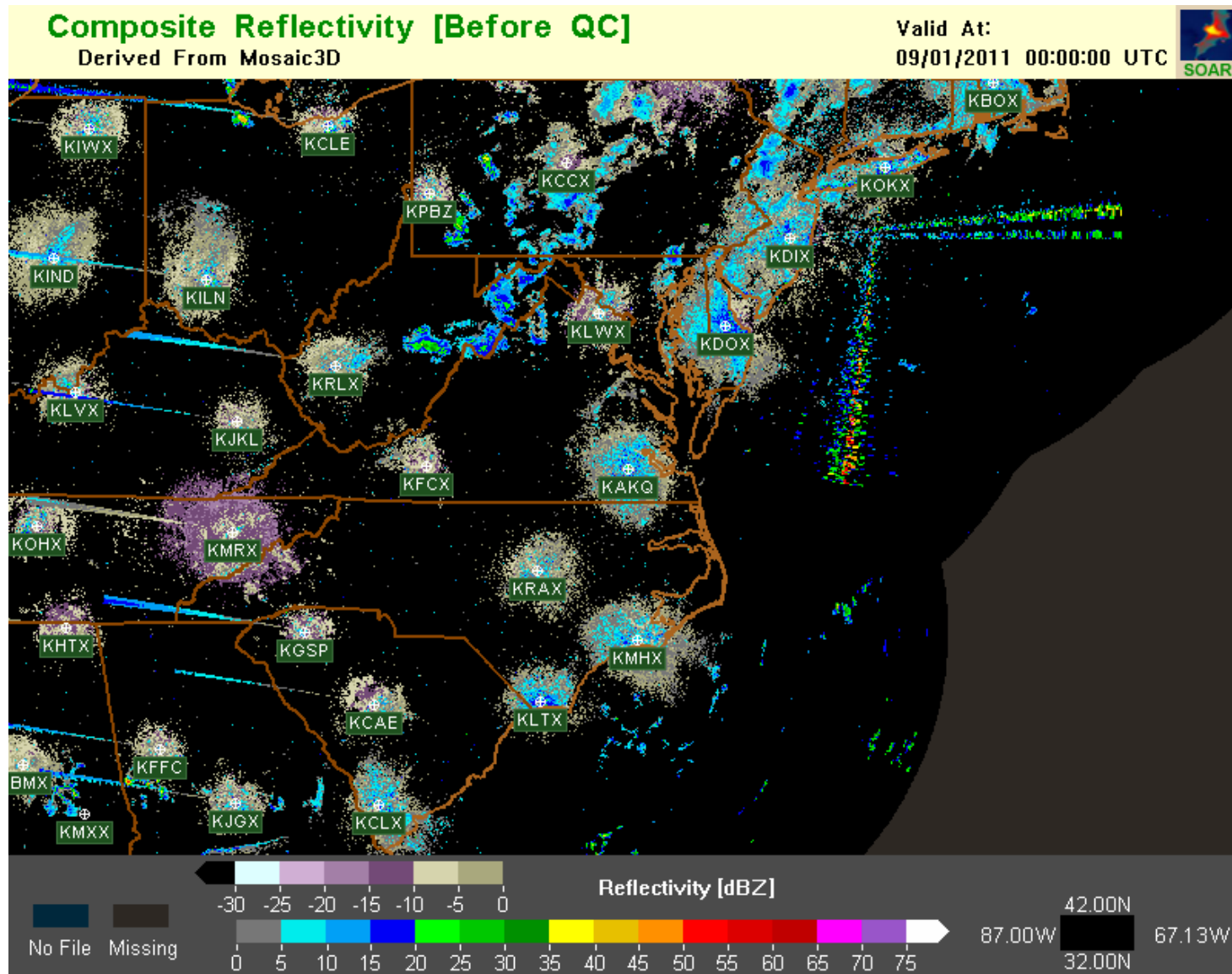
Valid At:

05/01/2011 09:00:00 UTC

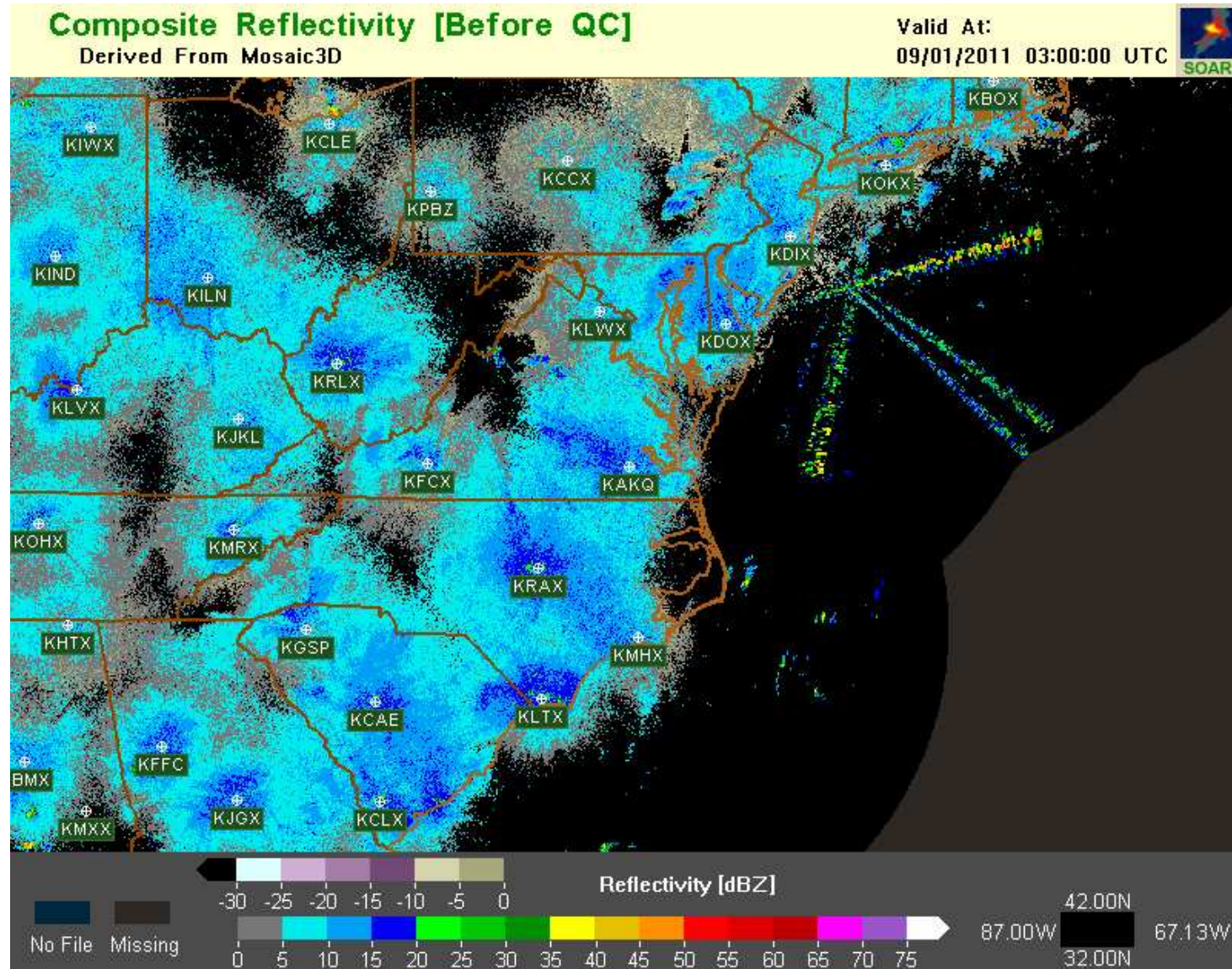




# 01 September at 00 UTC

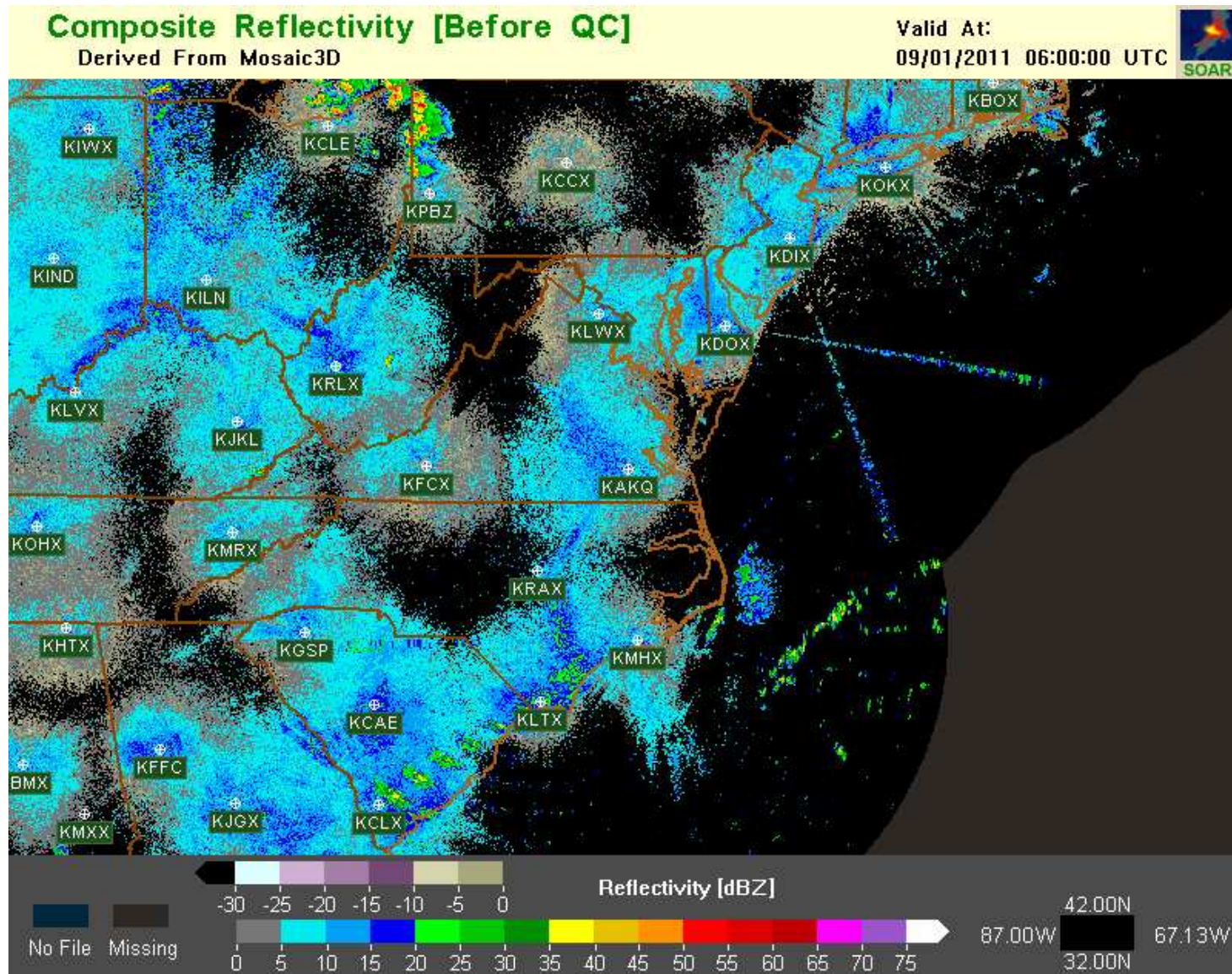


# 01 September at 03 UTC



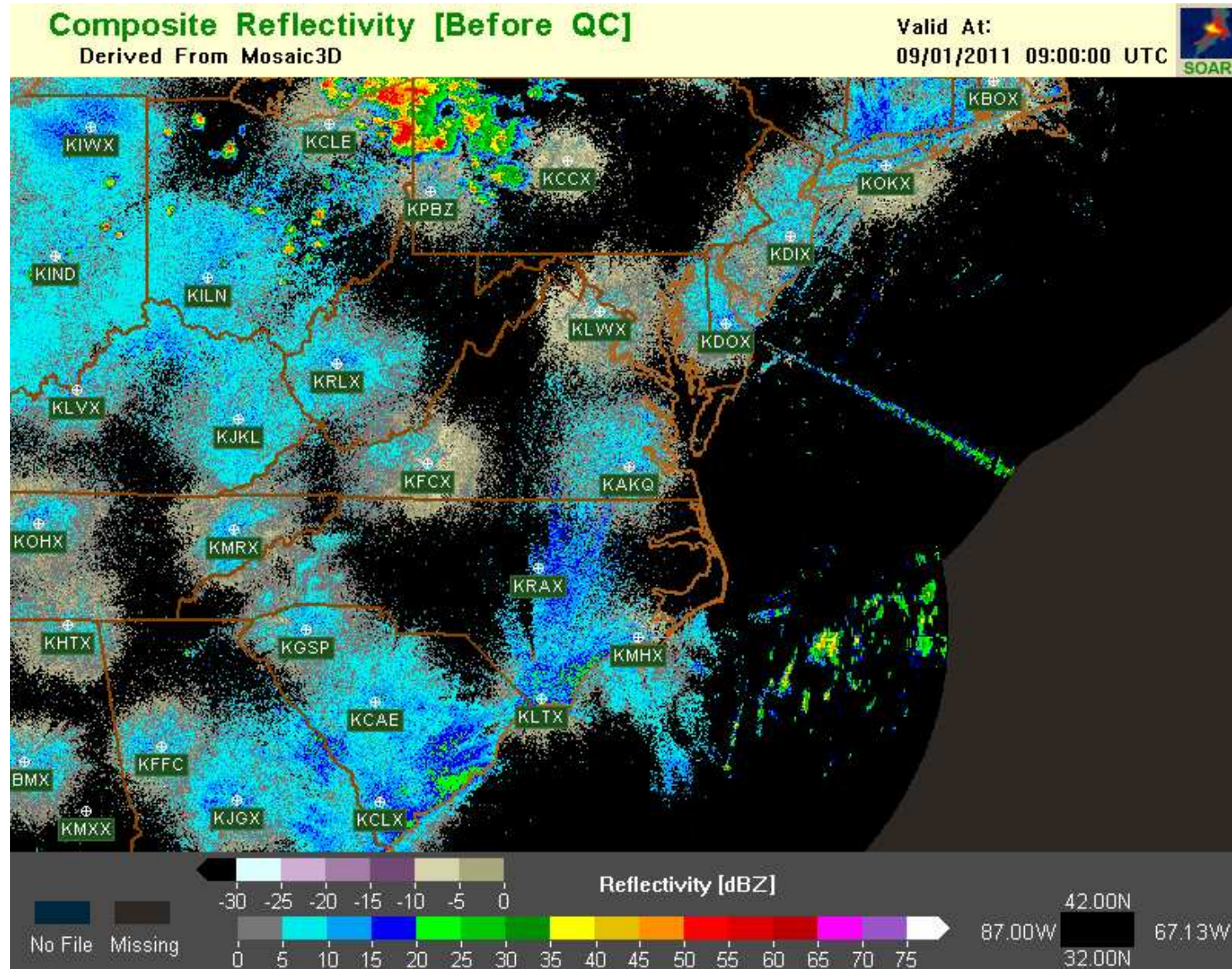


# 01 September at 06 UTC





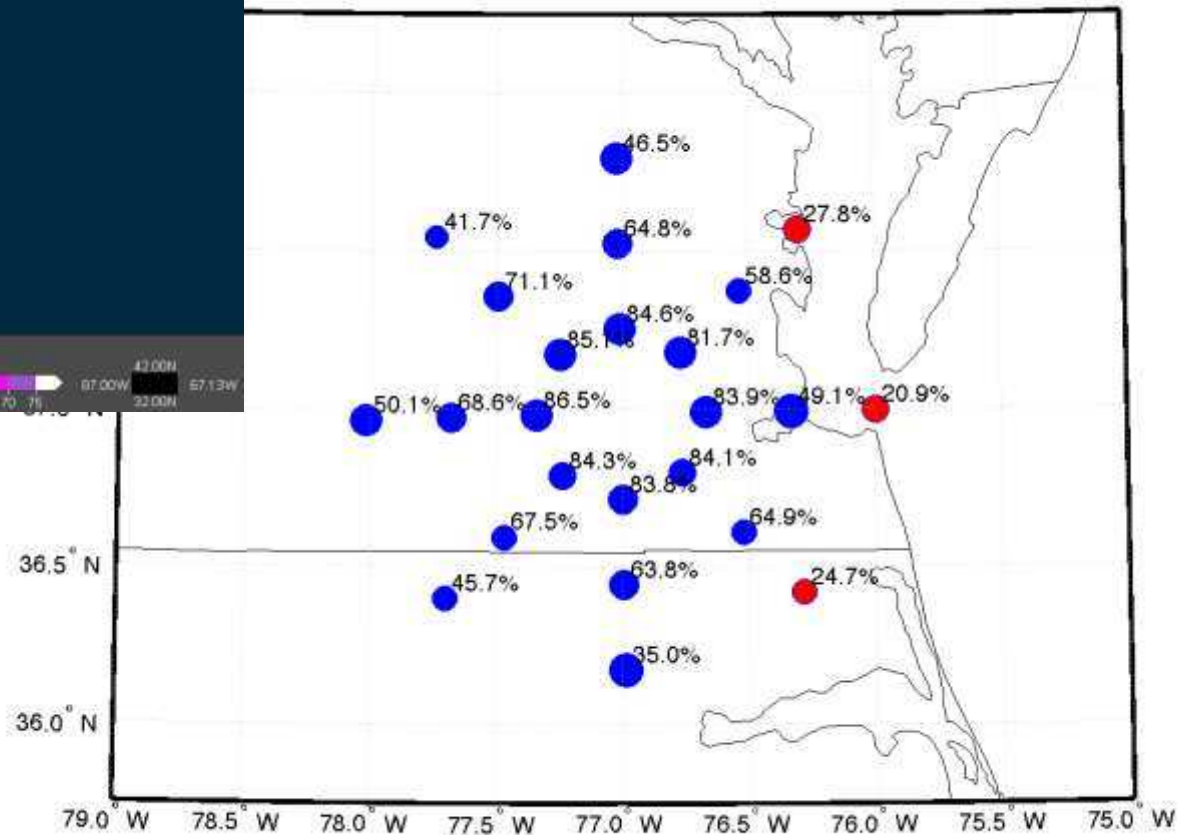
# 01 September at 09 UTC



# KAKQ: May for Sunset



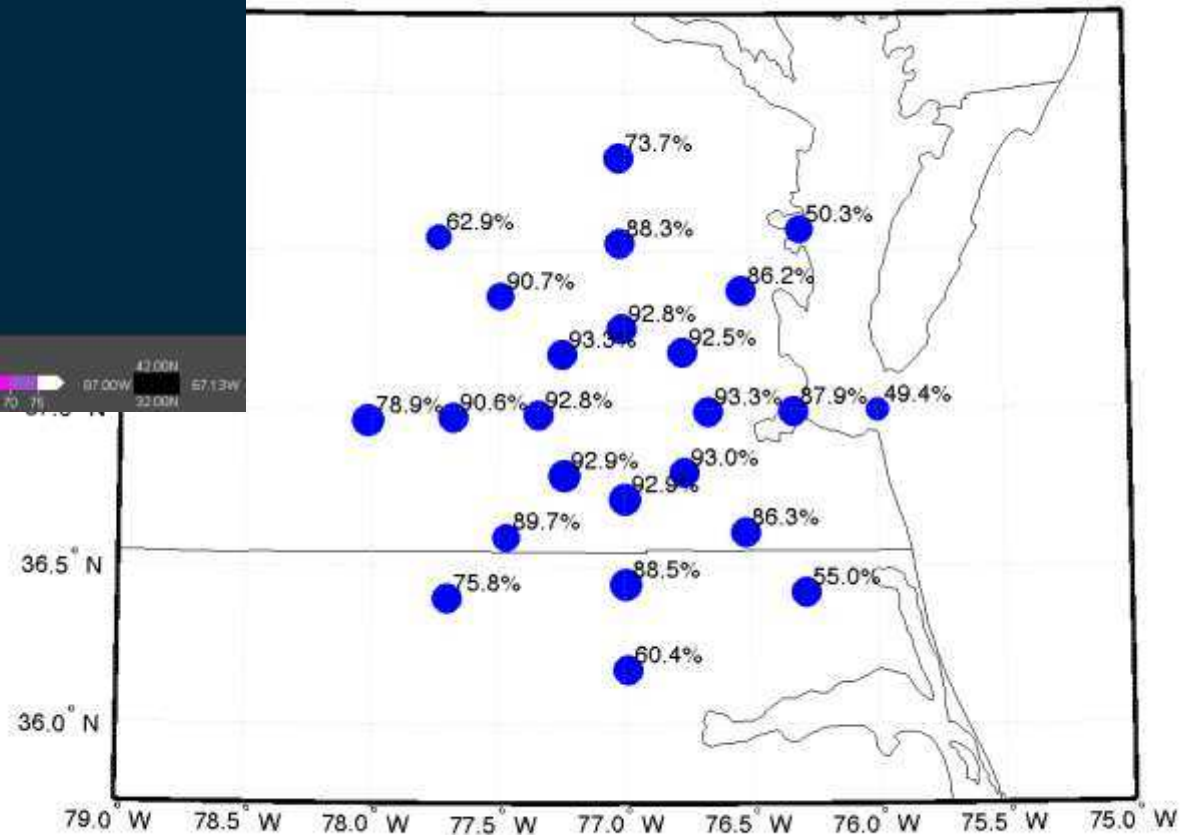
KAKQ: Sunset 2011 / 05 / 01-31



# KAKQ: May for Midnight



KAKQ: Midnight 2011 / 05 / 01-31

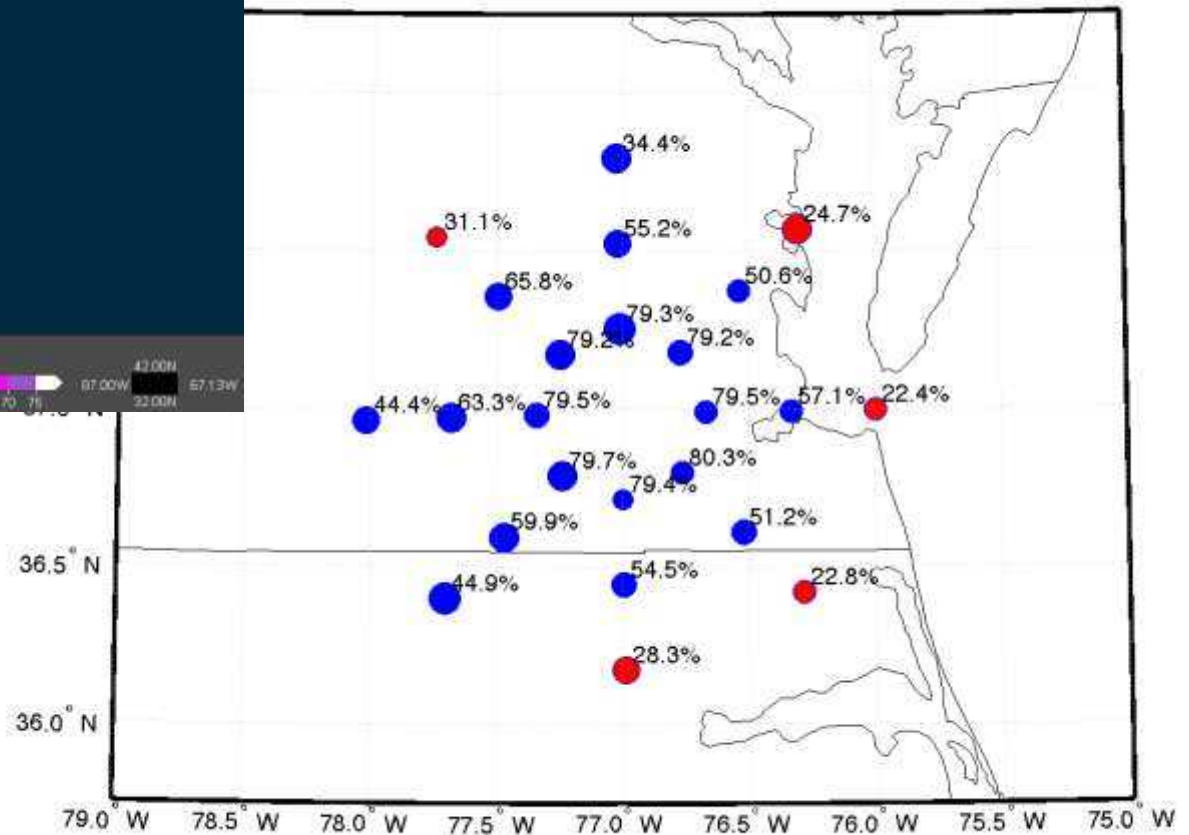




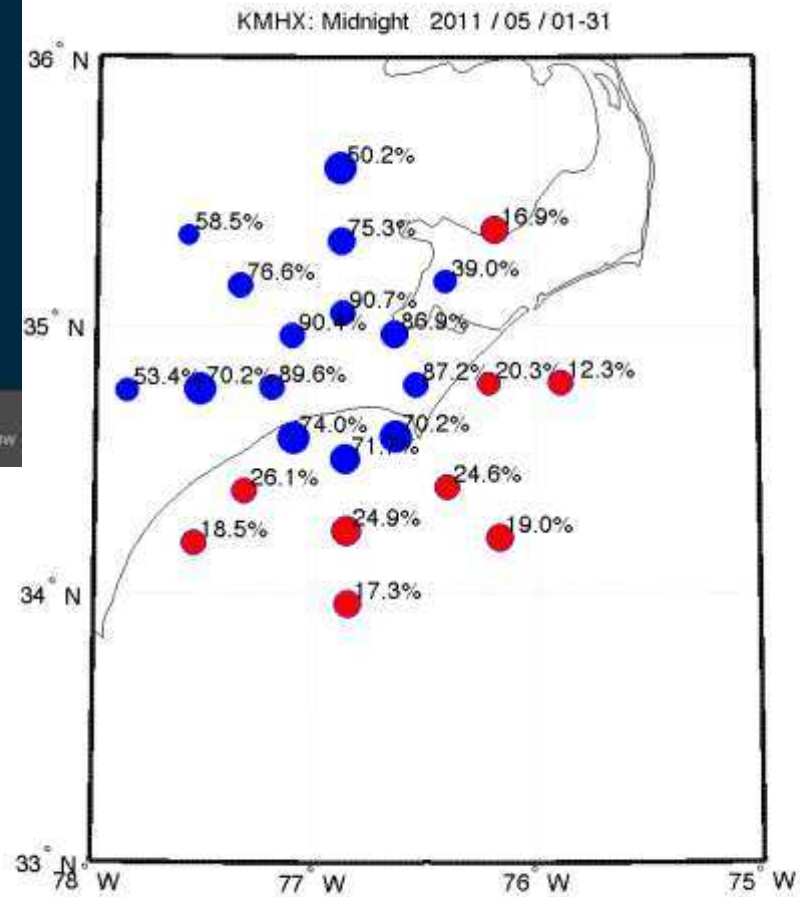
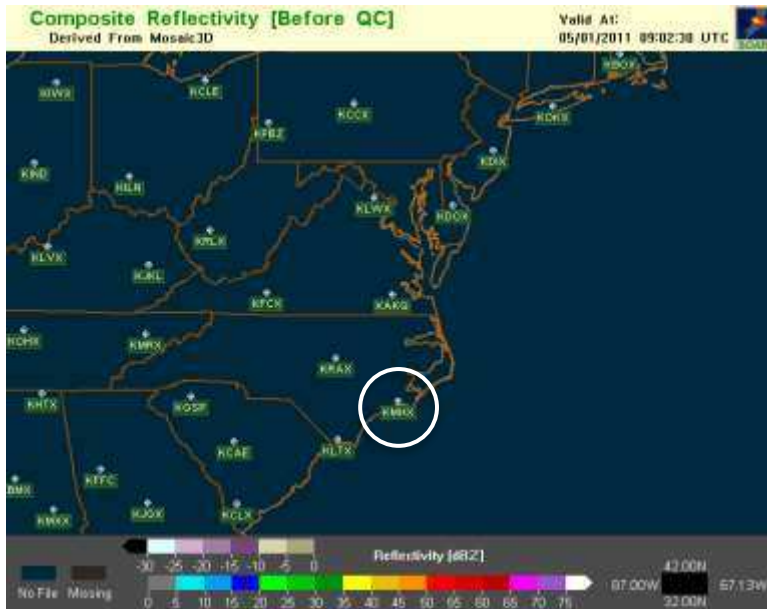
# KAKQ: May for Sunrise



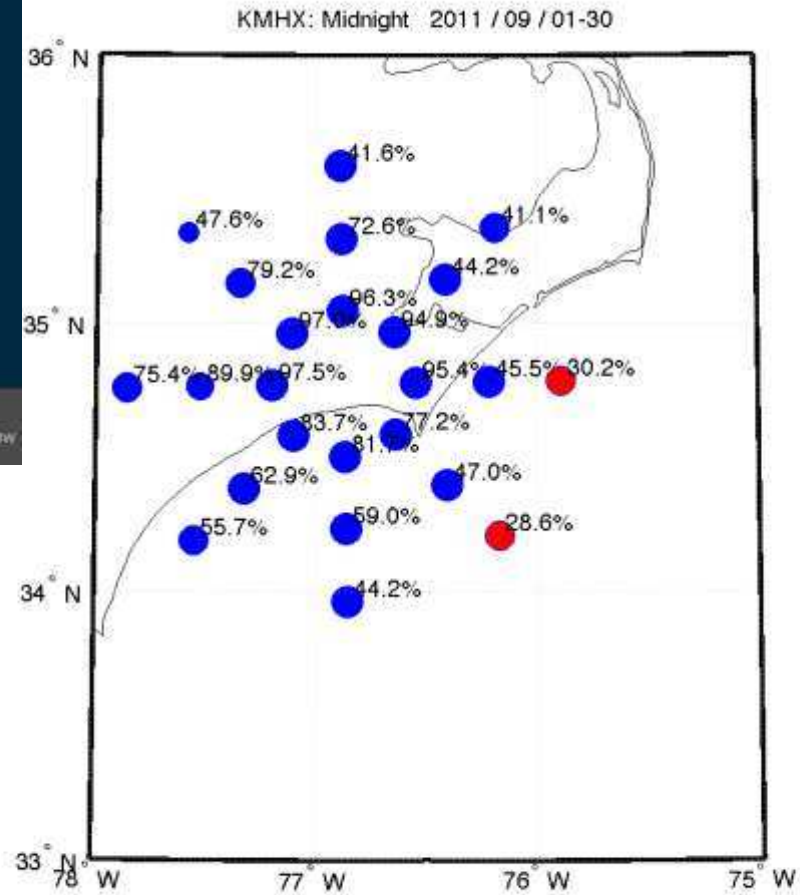
KAKQ: Sunrise 2011/05/01-31



# KMHX: May for Midnight

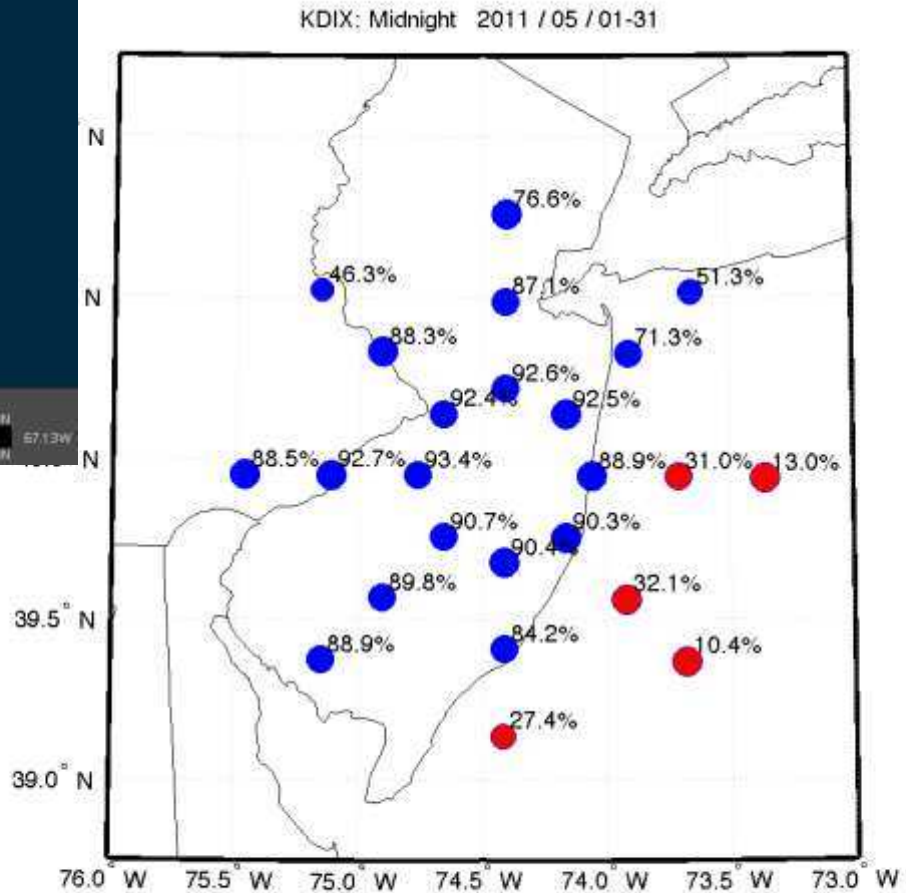


# KMHX: September for Midnight

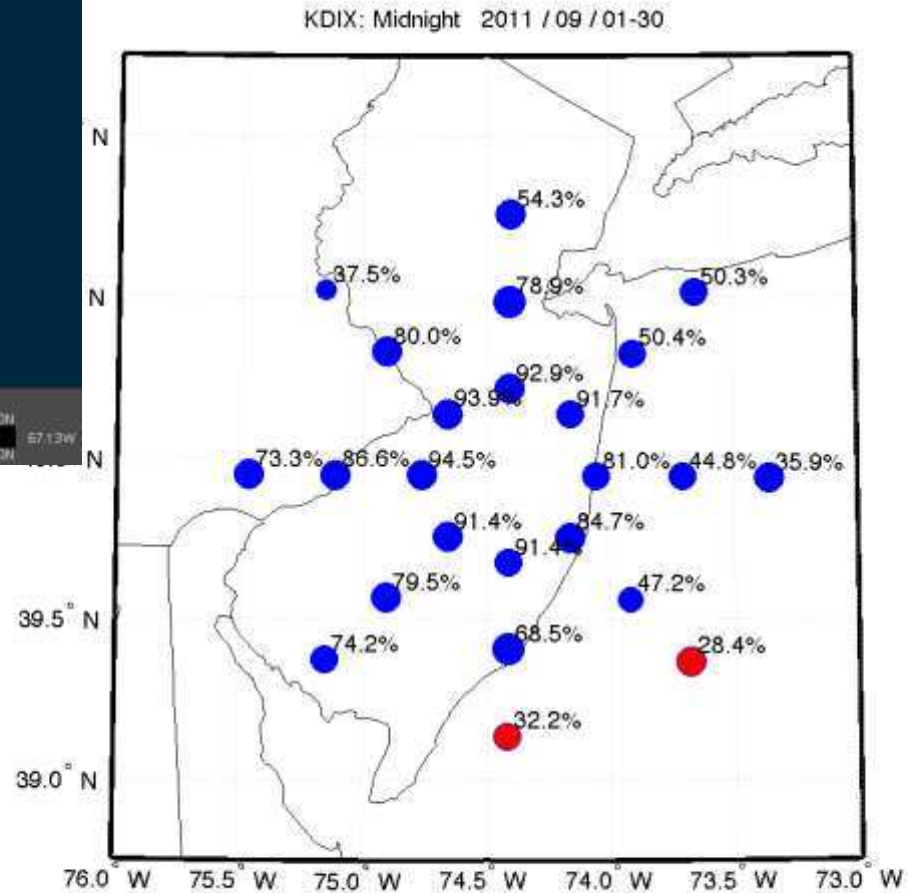




# KDIX: May for Midnight



# KDIX: September for Midnight



# Results: Overview

- Data for 2011 during spring (May) and fall (September and October) have been analyzed – additional years are being processed
- During spring, migrating birds appear to stay over land areas
- During fall migration more biological activity was detected over the Atlantic Ocean

# Summary & Conclusions

# Conclusions

- Weather radar is being used to investigate migration of birds along the Eastern Seaboard of the United States
- An algorithm was developed, which allows us to investigate migration traffic in the vicinity of various NEXRAD installations
- We have partly addressed the topic of whether an absence of signal implies an absence of biological scatter ... but not extensively

# On-going and Future Work

- Monthly averages of the data may be too long. Likely some biological questions will require less averaging. We are looking into this.
- Refine the graphical representation used in the figures
- Refine how the fraction of bioscatter is calculated
- Relate the average values to potentially meaningful biological parameters





# Acknowledgements

- Study being funded by the US Department of Energy
- Also participating in the study are
  - Evan Adams & Kate Williams – Biodiversity Research Institute
  - Victoria Ford & Jeff Kelly – University of Oklahoma



Hic sunt dracones

