

# Air Quality Screening Modeling

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2007 Meteorology Simulation with WRF

OTC Modeling Committee Meeting

September 16, 2010

Baltimore, MD



Presentation is based upon the following technical reports available from the OTC

Sensitivity testing of WRF Physics parameterizations and protocol for meteorological modeling in support of Regional SIP air quality modeling in the Ozone Transport Region (OTR)

Assessment of 2007 WRF meteorological modeling in support of regional air quality modeling in the Ozone Transport Region (OTR)

# Design Approach and Conclusions

Collaborative process with other RPOs, with assistance from University of Maryland

Participant States were GA, IA, MD, NC, NY, and VA

Setup benchmark and sensitivity simulations to develop a common configuration

Simulated WRF meteorological fields were found to be acceptable, based on performance metrics for surface-level temperature, wind speed and direction, water vapor, precipitation, wind profilers, cloud cover, and planetary boundary layer height (PBL)

# Initial Work

- Goal was to ensure that WRF simulation performed by each State modeling center would yield no differences in the simulated meteorological fields by the use of a common set of input data prepared by UMD for a 20 day period in summer and winter of 2007 with an agreed upon vertical and horizontal framework for WRF simulation
- This benchmark effort however showed significant differences between the state simulations , suggesting the need for a common configuration of hardware/software system
- Using a static compiled executable WRF code with 8 CPUs and a common operating system (OS), the numerical differences between the state modeling centers were found to be minimal

# WRF Sensitivity Comparison

- Goal: To determine a suitable configuration for annual simulation
- Selection:
  - Planetary Boundary Layer (PBL) Schemes: ACM2, MYJ, YSU, and modified Blackadar
  - Microphysics: WSM5 and WSM6
  - Land Surface: NOAH and PX
  - Time Periods: Summer and Winter Periods
- Comparison Analysis:
  - Techniques Development Laboratory (TDL) data – wind speed (with/without calms), temperature and humidity from National Weather Service (NWS)
  - Clean Air Status and Trends Network (CASTNet) data – wind speed and temperature
  - Wind profiler data from NWS
  - Satellite cloud cover data from UMD
  - Precipitation data from NWS

# Selected Configuration for 2007 OTC WRF Annual Modeling

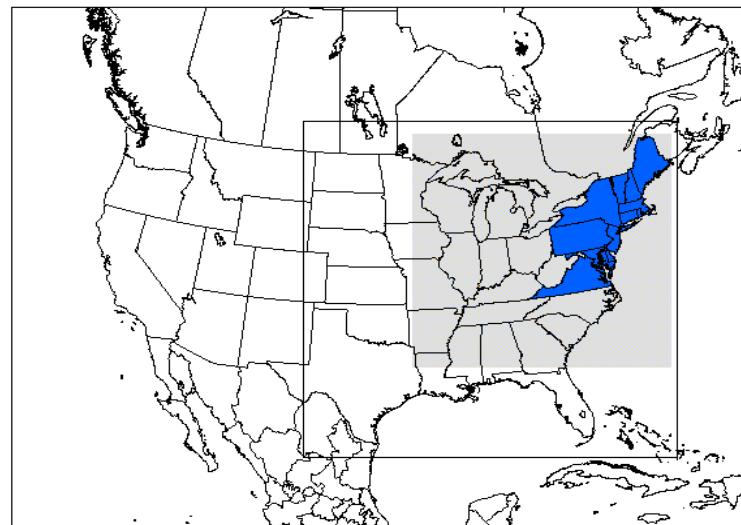
## WRF version 3.1

- North American Mesoscale model (NAM) analyses fields as input to 36 km, and 12 km domains in a 2-way nested mode
- OBSGRID for enhance nudging with observed data
- Model runs were at five and half days block with 12 hours overlap

## Model Options

- WSM6 microphysics
- RRTM long and shortwave radiation
- Pleim-Xiu land-surface and surface layer models
- Modified-Blackadar planetary boundary layer (PBL) scheme
- Kain-Fritsch cumulus parameterization
- Applied analysis nudging for winds above and below PBL
- Applied analysis nudging for temperature and moisture above PBL only

WRF Modeling domains at 36 and 12 km, and the 12 km Air Quality Modeling domain shown shaded, and the MANE-VU domain shown in blue



# WRF simulation Assessment

## TDL Data – Monthly Statistics

- Wind Speed: WRF over-predicted (positive bias) in winter months, and negative bias in summer months. The normalized bias is higher in summer due to observed low wind speeds
- Temperature: WRF predictions exhibit positive bias in winter and negative bias in summer
- Humidity: WRF overestimated observed humidity
- Overall: WRF Performance is in-line with acceptable range of bias reported for meteorological modeling systems

## An Example

Over the 12 km domain wind speed monthly statistics  
comparing simulation against TDL data

| Wind Speed                | Jan    | Feb    | March  | April  | May    | June   | July   | Aug    | Sept   | Oct    | Nov    | Dec    |
|---------------------------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|
| Sample_Size               | 600076 | 541340 | 601626 | 582365 | 597352 | 574771 | 592688 | 590041 | 576115 | 599801 | 582704 | 606478 |
| Mean_Obs                  | 3.61   | 3.84   | 3.73   | 3.82   | 3.04   | 2.62   | 2.34   | 2.26   | 2.53   | 2.90   | 3.23   | 3.12   |
| Mean_Model                | 3.71   | 3.97   | 3.67   | 3.73   | 2.89   | 2.45   | 2.18   | 2.10   | 2.55   | 2.98   | 3.37   | 3.21   |
| STD_Obs                   | 2.57   | 2.74   | 2.72   | 2.78   | 2.38   | 2.21   | 1.97   | 1.97   | 2.21   | 2.43   | 2.58   | 2.64   |
| STD_Model                 | 2.11   | 2.38   | 2.26   | 2.42   | 1.92   | 1.79   | 1.55   | 1.52   | 1.84   | 2.04   | 2.20   | 2.30   |
| Mean_Bias                 | 0.11   | 0.13   | -0.06  | -0.09  | -0.15  | -0.18  | -0.16  | -0.16  | 0.03   | 0.07   | 0.14   | 0.09   |
| STD_bias                  | 1.77   | 1.84   | 1.82   | 1.77   | 1.67   | 1.62   | 1.53   | 1.57   | 1.59   | 1.64   | 1.69   | 1.73   |
| RMSE                      | 1.78   | 1.84   | 1.82   | 1.78   | 1.68   | 1.63   | 1.54   | 1.57   | 1.59   | 1.64   | 1.70   | 1.74   |
| Normalized_Mean_Bias (%)  | 3.03   | 3.27   | -1.52  | -2.27  | -4.95  | -6.73  | -6.69  | -7.20  | 1.04   | 2.54   | 4.22   | 2.81   |
| Mean_Fractional_Bias (%)  | 24.57  | 22.68  | 20.08  | 17.98  | 22.31  | 25.04  | 28.19  | 30.11  | 35.60  | 33.06  | 31.91  | 30.95  |
| Mean_Error                | 1.29   | 1.34   | 1.34   | 1.34   | 1.27   | 1.22   | 1.17   | 1.18   | 1.19   | 1.21   | 1.24   | 1.25   |
| Normalized_Mean_Error (%) | 35.72  | 35.01  | 35.84  | 35.02  | 41.61  | 46.34  | 50.05  | 52.29  | 46.95  | 41.87  | 38.52  | 40.01  |
| Mean-Fractional_Error (%) | 58.24  | 57.29  | 60.84  | 61.61  | 74.43  | 83.54  | 88.52  | 92.07  | 84.48  | 75.07  | 67.76  | 70.97  |
| Correlation_Coefficient   | 0.73   | 0.75   | 0.75   | 0.78   | 0.72   | 0.69   | 0.65   | 0.63   | 0.71   | 0.74   | 0.76   | 0.76   |

## Similarly for temperature comparison monthly statistics over 12 km domain

| Temperature               | Jan    | Feb    | March  | April  | May    | June   | July   | Aug    | Sept   | Oct    | Nov    | Dec    |
|---------------------------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|
| Sample_Size               | 615669 | 555571 | 618981 | 598522 | 618278 | 596032 | 613847 | 612687 | 595867 | 615711 | 595098 | 617887 |
| Mean_Obs                  | 272.98 | 268.91 | 279.09 | 282.37 | 290.24 | 294.48 | 295.42 | 296.54 | 292.54 | 288.08 | 278.59 | 273.56 |
| Mean_Model                | 273.50 | 269.17 | 278.59 | 281.98 | 289.48 | 293.64 | 294.82 | 296.20 | 292.58 | 288.38 | 279.22 | 273.93 |
| STD_Obs                   | 9.03   | 9.38   | 10.00  | 8.48   | 6.91   | 5.89   | 5.29   | 6.14   | 6.60   | 7.06   | 7.04   | 8.32   |
| STD_Model                 | 8.02   | 8.63   | 9.23   | 7.82   | 6.44   | 5.68   | 5.10   | 5.66   | 5.75   | 6.21   | 6.31   | 7.67   |
| Mean_Bias                 | 0.52   | 0.25   | -0.50  | -0.39  | -0.77  | -0.84  | -0.61  | -0.34  | 0.04   | 0.30   | 0.63   | 0.37   |
| STD_bias                  | 2.22   | 2.22   | 2.43   | 2.32   | 2.39   | 2.19   | 2.05   | 2.08   | 2.11   | 2.16   | 2.10   | 2.24   |
| RMSE                      | 2.27   | 2.24   | 2.48   | 2.35   | 2.52   | 2.35   | 2.13   | 2.10   | 2.11   | 2.18   | 2.20   | 2.27   |
| Normalized_Mean_Bias (%)  | 0.19   | 0.09   | -0.18  | -0.14  | -0.26  | -0.29  | -0.20  | -0.11  | 0.01   | 0.10   | 0.23   | 0.14   |
| Mean_Fractional_Bias (%)  | 0.20   | 0.10   | -0.17  | -0.13  | -0.26  | -0.28  | -0.20  | -0.11  | 0.02   | 0.11   | 0.23   | 0.14   |
| Mean_Error                | 1.64   | 1.64   | 1.84   | 1.75   | 1.89   | 1.78   | 1.61   | 1.60   | 1.61   | 1.63   | 1.62   | 1.64   |
| Normalized_Mean_Error (%) | 0.60   | 0.61   | 0.66   | 0.62   | 0.65   | 0.61   | 0.55   | 0.54   | 0.55   | 0.57   | 0.58   | 0.60   |
| Mean-Fractional_Error (%) | 0.61   | 0.61   | 0.66   | 0.62   | 0.65   | 0.61   | 0.55   | 0.54   | 0.55   | 0.57   | 0.58   | 0.60   |
| Correlation_Coefficient   | 0.97   | 0.97   | 0.97   | 0.96   | 0.94   | 0.93   | 0.92   | 0.94   | 0.95   | 0.96   | 0.96   | 0.96   |

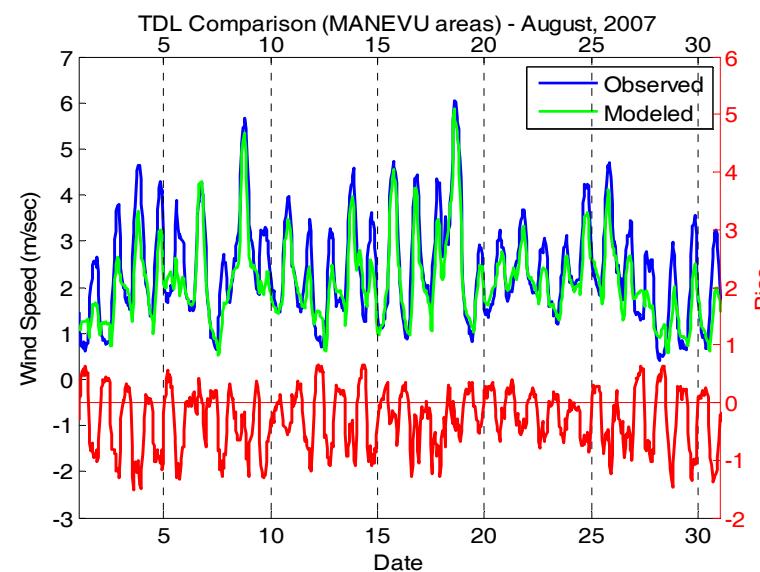
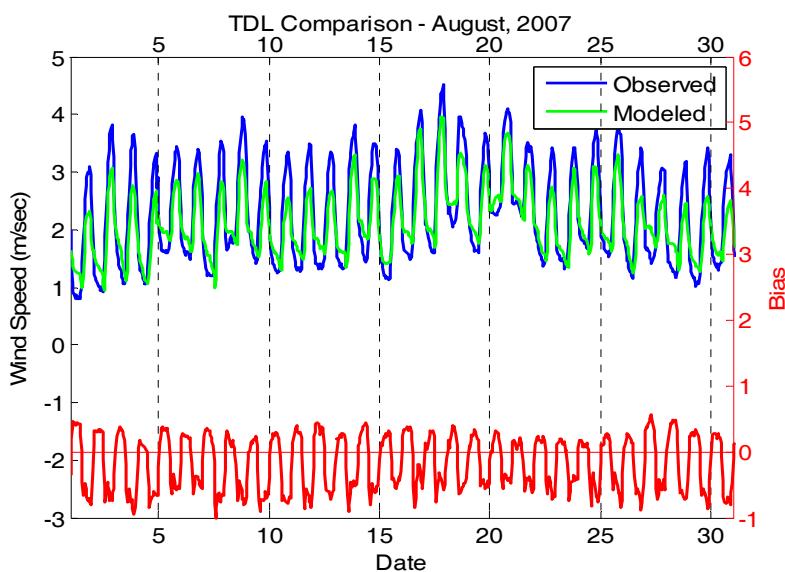
An Example      Over the **MANEVU** region at 12 km grid spacing  
**Wind Speed** monthly statistics comparing **WRF** simulation against TDL data

| Wind Speed                | Jan    | Feb    | March  | April  | May    | June   | July   | Aug    | Sept   | Oct    | Nov    | Dec    |
|---------------------------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|
| Sample_Size               | 124364 | 112077 | 124880 | 121021 | 123017 | 117069 | 121552 | 120333 | 118168 | 124638 | 121222 | 126654 |
| Mean_Obs                  | 3.71   | 4.21   | 4.03   | 3.92   | 3.02   | 2.82   | 2.51   | 2.36   | 2.47   | 2.73   | 3.21   | 3.31   |
| Mean_Model                | 3.64   | 4.11   | 3.81   | 3.67   | 2.72   | 2.54   | 2.26   | 2.09   | 2.33   | 2.60   | 3.16   | 3.24   |
| STD_Obs                   | 3.05   | 3.19   | 3.11   | 2.91   | 2.47   | 2.36   | 2.15   | 2.16   | 2.35   | 2.55   | 2.80   | 3.03   |
| STD_Model                 | 2.22   | 2.56   | 2.32   | 2.39   | 1.73   | 1.67   | 1.56   | 1.49   | 1.60   | 1.81   | 2.08   | 2.39   |
| Mean_Bias                 | -0.08  | -0.10  | -0.23  | -0.25  | -0.30  | -0.27  | -0.25  | -0.28  | -0.14  | -0.13  | -0.05  | -0.07  |
| STD_bias                  | 2.30   | 2.31   | 2.29   | 2.03   | 1.90   | 1.85   | 1.69   | 1.75   | 1.82   | 1.95   | 2.05   | 2.16   |
| RMSE                      | 2.30   | 2.31   | 2.30   | 2.05   | 1.92   | 1.87   | 1.71   | 1.77   | 1.83   | 1.95   | 2.05   | 2.16   |
| Normalized_Mean_Bias (%)  | -2.05  | -2.37  | -5.59  | -6.40  | -10.01 | -9.69  | -9.89  | -11.67 | -5.61  | -4.74  | -1.61  | -2.22  |
| Mean_Fractional_Bias (%)  | 26.53  | 21.28  | 18.74  | 16.86  | 22.27  | 24.22  | 29.25  | 30.88  | 37.92  | 35.05  | 32.46  | 31.34  |
| Mean_Error                | 1.48   | 1.54   | 1.55   | 1.46   | 1.38   | 1.32   | 1.26   | 1.26   | 1.26   | 1.32   | 1.38   | 1.42   |
| Normalized_Mean_Error (%) | 39.99  | 36.66  | 38.44  | 37.30  | 45.52  | 46.96  | 50.10  | 53.44  | 51.20  | 48.18  | 42.83  | 42.70  |
| Mean-Fractional_Error (%) | 66.45  | 61.60  | 63.16  | 64.41  | 79.43  | 82.50  | 90.62  | 94.92  | 91.57  | 86.37  | 74.66  | 75.68  |
| Correlation_Coefficient   | 0.66   | 0.70   | 0.68   | 0.72   | 0.64   | 0.62   | 0.63   | 0.60   | 0.63   | 0.65   | 0.68   | 0.71   |

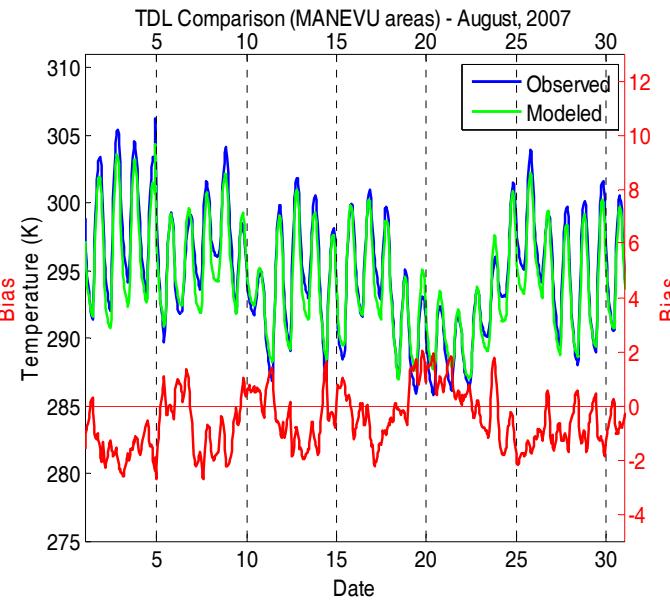
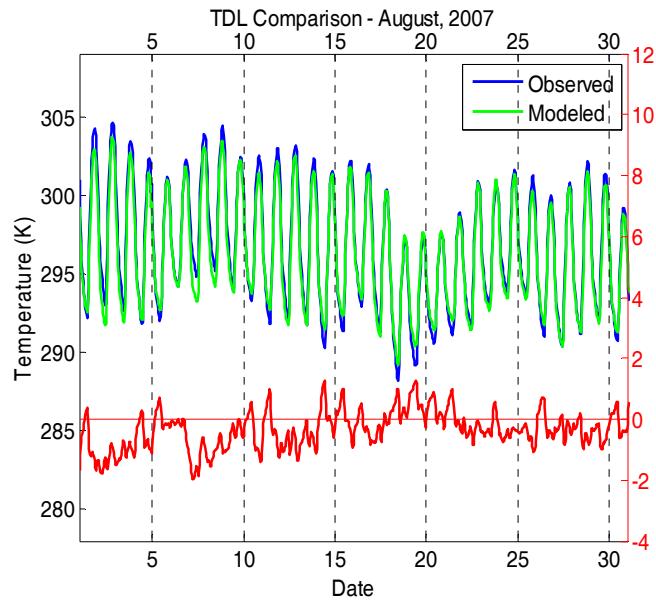
An Example Over the **MANEVU** region at 12 km grid spacing  
**Temperature** monthly statistics comparing **WRF** simulation against TDL data

| Temperature               | Jan    | Feb    | March  | April  | May    | June   | July   | Aug    | Sept   | Oct    | Nov    | Dec    |
|---------------------------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|
| Sample_Size               | 130525 | 117480 | 131319 | 127015 | 131983 | 126779 | 131809 | 130928 | 127676 | 132503 | 127340 | 131827 |
| Mean_Obs                  | 272.73 | 267.94 | 275.76 | 280.42 | 288.67 | 293.00 | 294.67 | 294.79 | 291.53 | 287.60 | 277.86 | 272.59 |
| Mean_Model                | 273.12 | 268.08 | 275.15 | 279.83 | 287.54 | 291.95 | 293.75 | 294.26 | 291.32 | 287.66 | 278.31 | 272.86 |
| STD_Obs                   | 8.16   | 6.12   | 8.26   | 6.89   | 6.71   | 5.54   | 4.99   | 5.48   | 6.03   | 6.40   | 5.50   | 5.55   |
| STD_Model                 | 7.06   | 5.42   | 7.16   | 6.02   | 6.06   | 5.16   | 4.71   | 4.85   | 4.89   | 5.25   | 4.74   | 4.93   |
| Mean_Bias                 | 0.39   | 0.14   | -0.61  | -0.59  | -1.13  | -1.05  | -0.92  | -0.53  | -0.20  | 0.06   | 0.45   | 0.27   |
| STD_bias                  | 2.14   | 2.05   | 2.43   | 2.26   | 2.39   | 2.15   | 2.05   | 2.11   | 2.20   | 2.26   | 2.01   | 2.09   |
| RMSE                      | 2.18   | 2.05   | 2.50   | 2.33   | 2.64   | 2.40   | 2.24   | 2.18   | 2.21   | 2.26   | 2.06   | 2.11   |
| Normalized_Mean_Bias (%)  | 0.14   | 0.05   | -0.22  | -0.21  | -0.39  | -0.36  | -0.31  | -0.18  | -0.07  | 0.02   | 0.16   | 0.10   |
| Mean_Fractional_Bias (%)  | 0.15   | 0.06   | -0.21  | -0.20  | -0.39  | -0.36  | -0.31  | -0.18  | -0.06  | 0.03   | 0.17   | 0.10   |
| Mean_Error                | 1.60   | 1.46   | 1.86   | 1.69   | 2.00   | 1.85   | 1.73   | 1.68   | 1.69   | 1.71   | 1.52   | 1.55   |
| Normalized_Mean_Error (%) | 0.59   | 0.54   | 0.67   | 0.60   | 0.69   | 0.63   | 0.59   | 0.57   | 0.58   | 0.59   | 0.55   | 0.57   |
| Mean-Fractional_Error (%) | 0.59   | 0.55   | 0.67   | 0.60   | 0.69   | 0.63   | 0.59   | 0.57   | 0.58   | 0.60   | 0.55   | 0.57   |
| Correlation_Coefficient   | 0.97   | 0.94   | 0.96   | 0.95   | 0.93   | 0.92   | 0.91   | 0.92   | 0.94   | 0.94   | 0.93   | 0.93   |

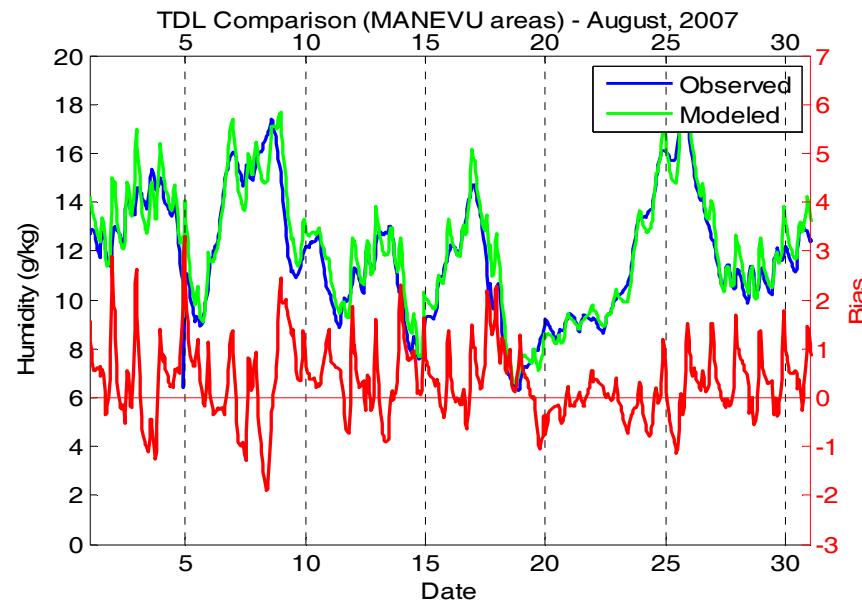
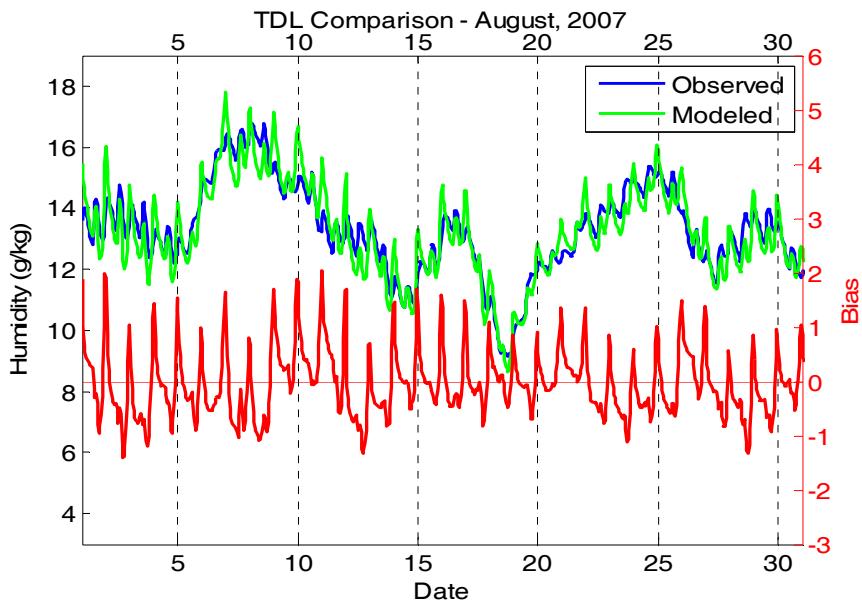
# Comparison of WRF and TDL daily Wind Speed and bias for August 2007 over 12 km entire domain and MANEVU Region



# Comparison of WRF and TDL daily Temperature and bias for August 2007 over 12 km entire domain and MANEVU Region



# Comparison of WRF and TDL daily humidity and bias for August 2007 over 12 km entire domain and MANEVU Region



- WRF predicts the observed double peak
- However, it overpredicts the early morning peak and underpredicts the day time minimum

# CASTNet Data

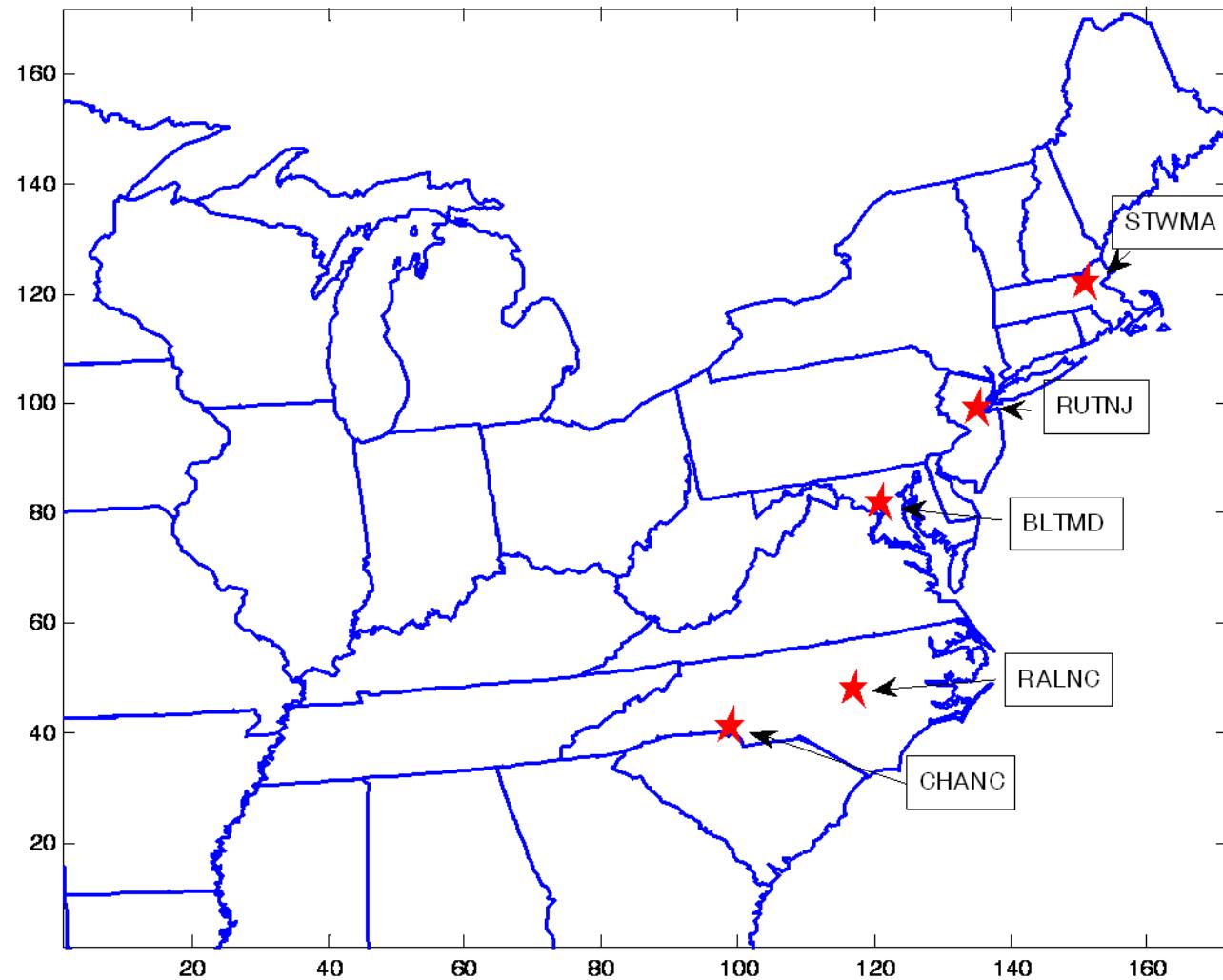
- Wind Speed: WRF over predicted wind speed compared to measured by CASTNet
- Temperature: WRF predicted higher temperatures than those measured by CASTNet
- Note: Unlike NWS-TDL, CASTNet data were not used in the FDDA (four dimensional data assimilation) or nudging process
- Also, CASTNet measurements are at rural stations

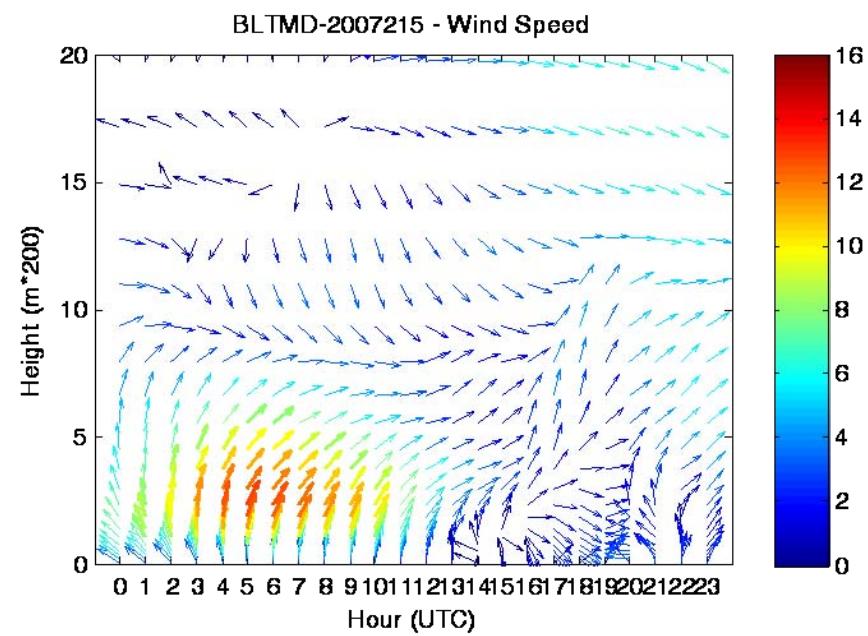
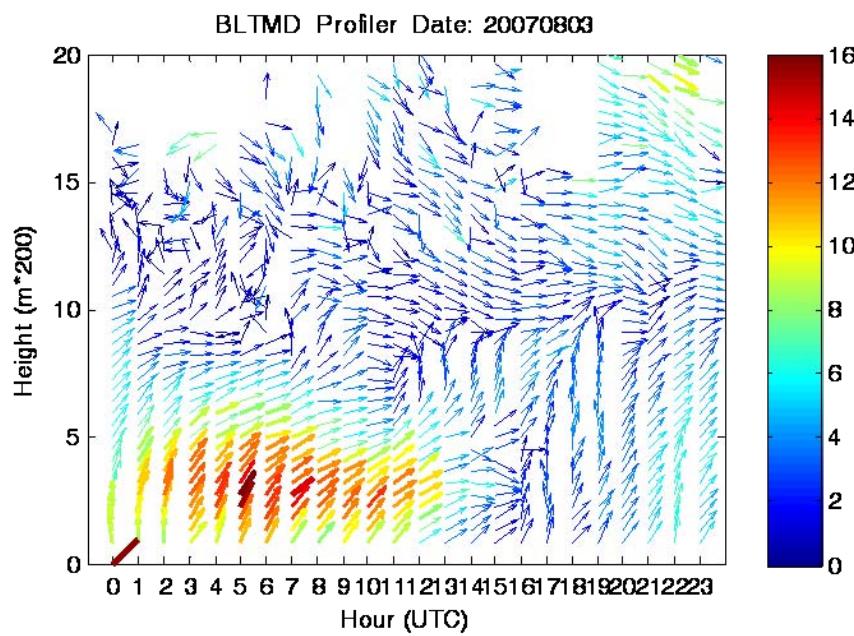
# Over the 12 km domain wind speed monthly statistics comparing WRF simulation against CASTNet data

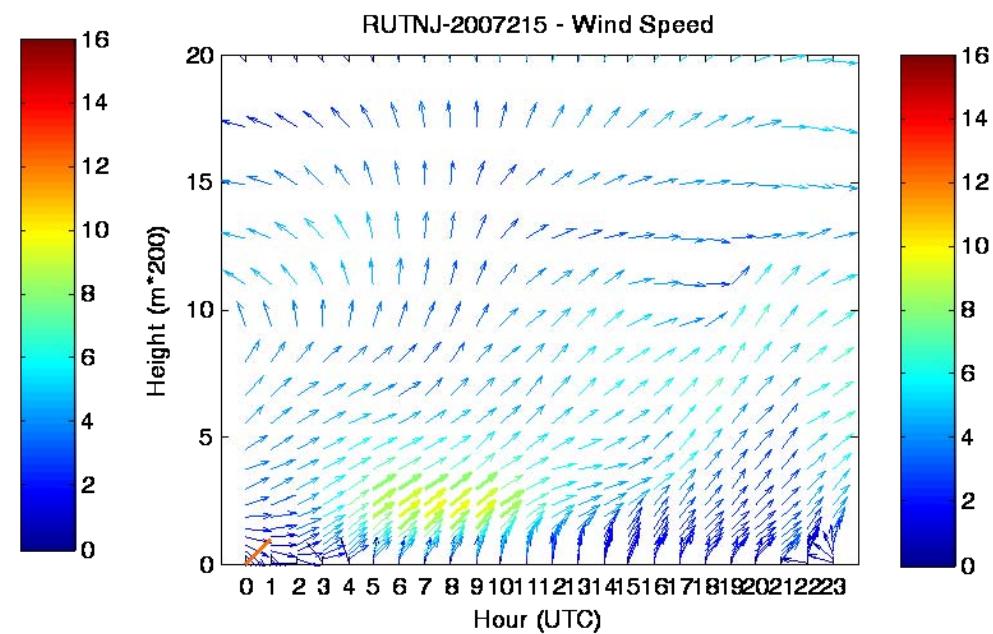
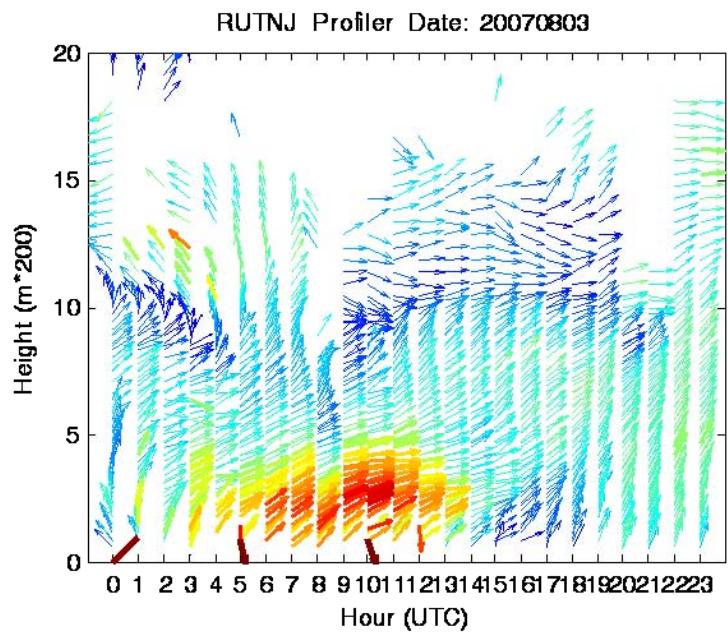
| Wind Speed               | Jan   | Feb   | March | April | May   | June  | July  | Aug   | Sept  | Oct   | Nov   | Dec   |
|--------------------------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|
| Sample_Size              | 36234 | 31973 | 35355 | 32630 | 34636 | 33309 | 34065 | 33890 | 33507 | 35871 | 35561 | 37073 |
| Mean_Obs                 | 2.86  | 2.98  | 2.87  | 3.02  | 2.22  | 1.93  | 1.77  | 1.73  | 1.85  | 2.26  | 2.52  | 2.58  |
| Mean_Model               | 3.71  | 3.87  | 3.59  | 3.67  | 2.54  | 2.20  | 2.06  | 1.89  | 2.11  | 2.74  | 3.18  | 3.20  |
| STD_Obs                  | 1.91  | 2.03  | 1.98  | 2.14  | 1.61  | 1.42  | 1.23  | 1.18  | 1.33  | 1.68  | 1.82  | 1.96  |
| STD_Model                | 2.03  | 2.31  | 2.17  | 2.29  | 1.72  | 1.59  | 1.41  | 1.35  | 1.54  | 1.85  | 2.01  | 2.25  |
| Mean_Bias                | 0.85  | 0.88  | 0.71  | 0.65  | 0.32  | 0.27  | 0.30  | 0.17  | 0.26  | 0.48  | 0.66  | 0.62  |
| STD_bias                 | 1.66  | 1.86  | 1.77  | 1.76  | 1.46  | 1.37  | 1.26  | 1.24  | 1.32  | 1.46  | 1.55  | 1.68  |
| RMSE                     | 1.86  | 2.06  | 1.90  | 1.87  | 1.50  | 1.40  | 1.30  | 1.25  | 1.34  | 1.54  | 1.68  | 1.79  |
| Normalized_Mean_Bias(%)  | 29.67 | 29.69 | 24.78 | 21.39 | 14.40 | 14.00 | 16.84 | 9.65  | 14.17 | 21.35 | 26.29 | 24.03 |
| Mean_Fractional_Bias(%)  | 25.67 | 21.68 | 18.72 | 15.33 | 4.53  | 1.01  | 2.99  | -4.76 | -0.50 | 10.18 | 18.51 | 14.37 |
| Mean_Error               | 1.42  | 1.53  | 1.43  | 1.44  | 1.19  | 1.09  | 1.03  | 0.98  | 1.06  | 1.20  | 1.29  | 1.31  |
| Normalized_Mean_Error(%) | 49.60 | 51.31 | 49.87 | 47.82 | 53.47 | 56.67 | 58.26 | 56.90 | 57.15 | 53.09 | 51.35 | 50.64 |
| Mean-Fractional_Error(%) | 52.64 | 54.33 | 54.86 | 56.13 | 65.91 | 68.73 | 69.50 | 70.64 | 70.13 | 63.52 | 58.09 | 56.50 |
| Correlation_Coefficient  | 0.65  | 0.64  | 0.64  | 0.69  | 0.61  | 0.59  | 0.55  | 0.53  | 0.59  | 0.66  | 0.68  | 0.69  |

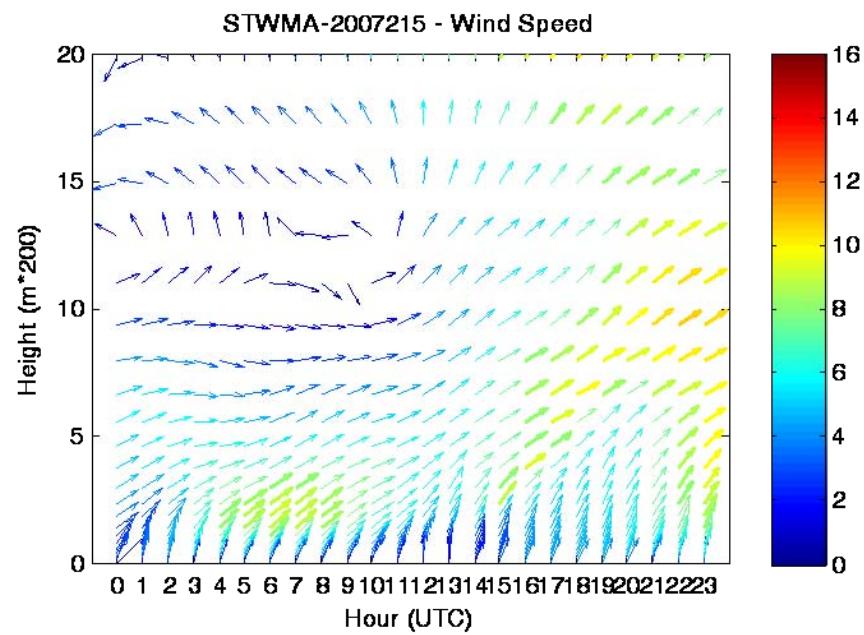
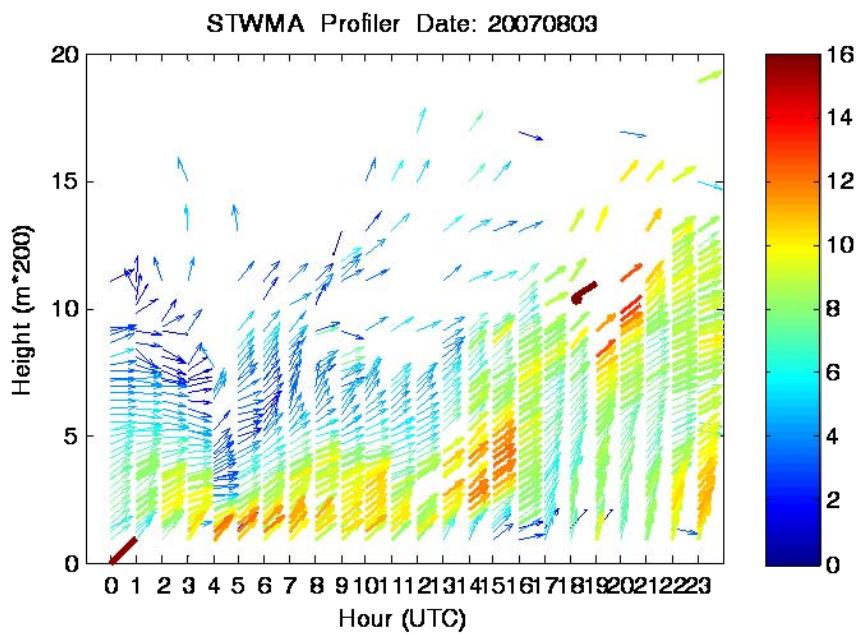
# Wind Profiler Data

- Five sites:
  - Baltimore, MD (BLTMD),
  - Rutgers, NJ (RUTNJ),
  - Stowe, MA (STWMA),
  - Charlotte, NC (CHANC), and
  - Raleigh, NC (RALNC)
- Qualitative comparison of the measured vertical profile of wind speed with WRF predictions



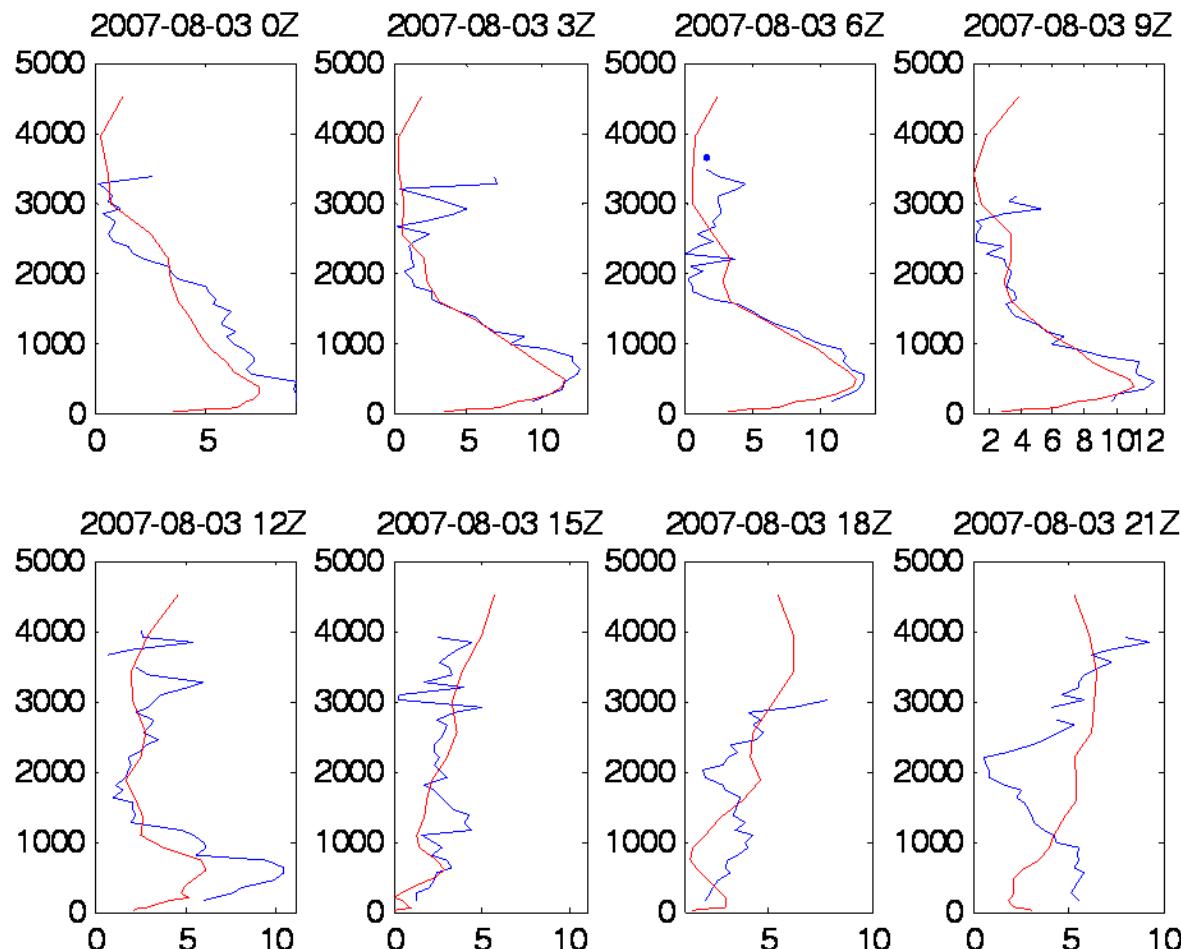






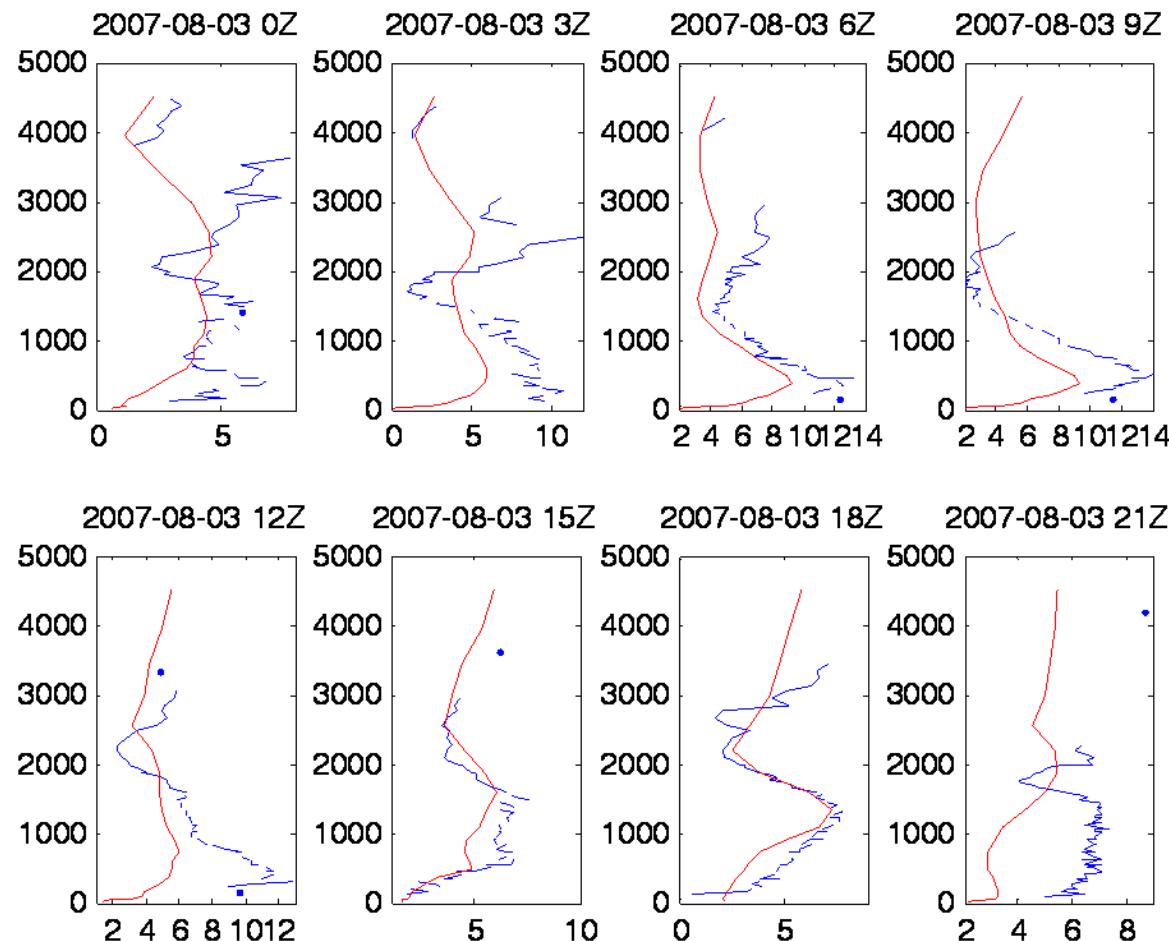
# BLTMD

BLUE: Wind Profiler  
RED: WRF



# RUTNJ

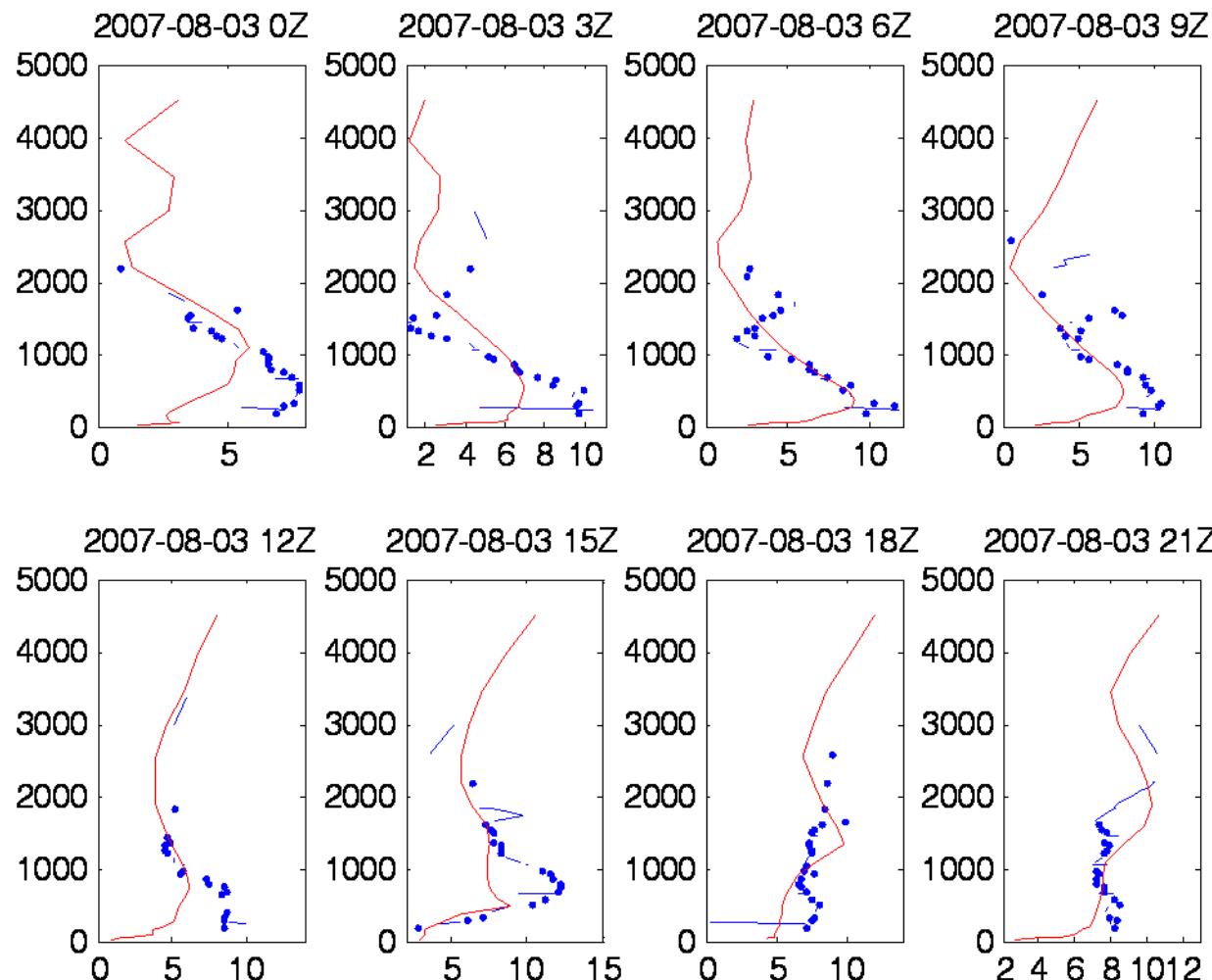
BLUE: Wind Profiler  
RED: WRF



# STWMA

BLUE: Wind Profiler

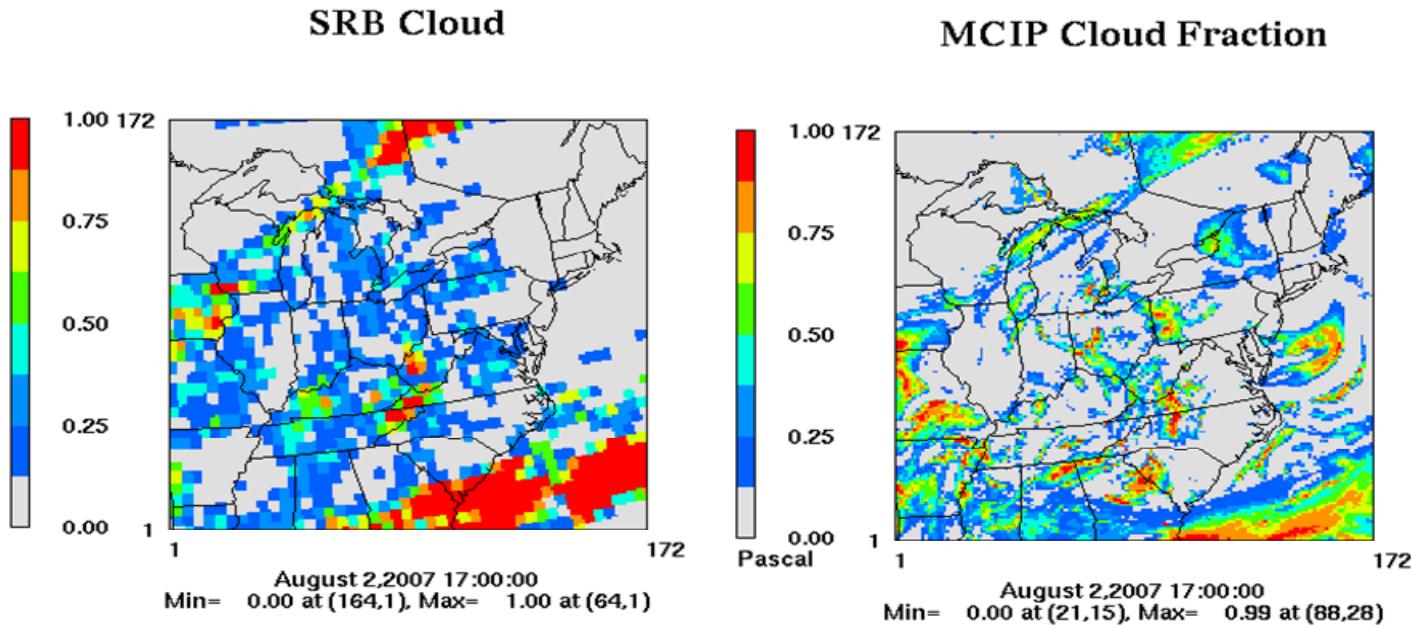
RED: WRF



# Comparison of Observed and WRF Cloud Fraction

- Using GOES-12 satellite observations derived cloud fraction from UMD's Surface Radiation Budget (SRB)
- Cloud fraction estimates are made on an hourly basis at  $0.5^{\circ}$  resolution for an area bounded by  $70\text{--}125^{\circ}$  W longitude and  $25\text{--}50^{\circ}$  N latitude
- MCIP processed cloud fraction using WRF output

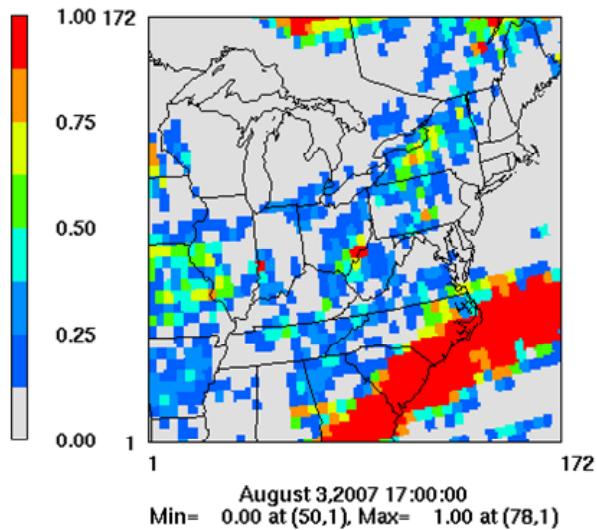
# Comparison of Cloud fraction based on observed (SRB) and WRF predicted (MCIP) for August 2, 2007 at 1700



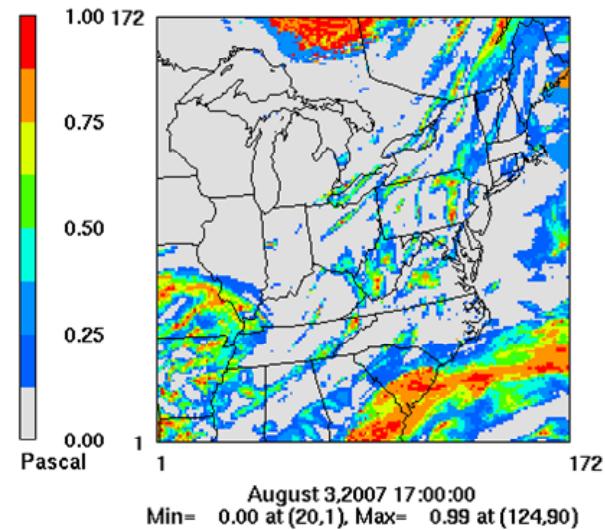
General agreement in pattern over the domain

## Comparison of Cloud fraction based on observed (SRB) and WRF predicted (MCIP) for August 3, 2007 at 1700

SRB Cloud



MCIP Cloud Fraction

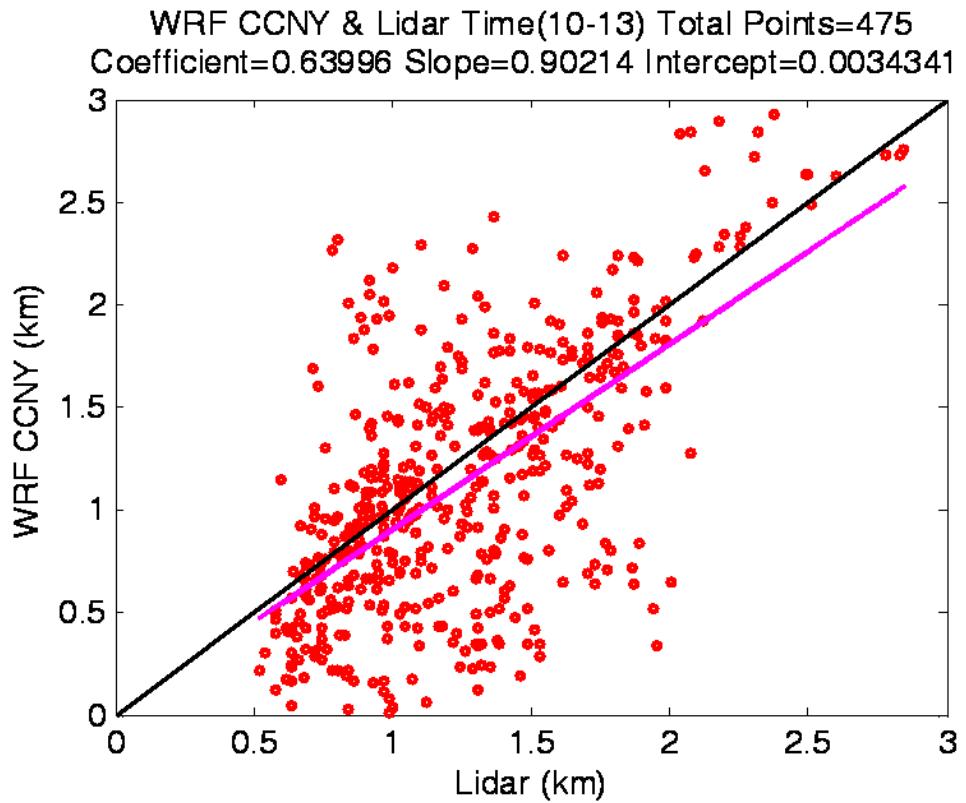


General agreement in pattern over the domain

# Planetary Boundary Layer (PBL) Height Comparison

- Lidar-based observed PBL height at CCNY
- WRF-based PBL height at CCNY grid and maximum value of 9 by 9 grid surrounding CCNY grid
- The maximum of the 9 by 9 grid is found to be closer to Lidar-based observed PBL height

## Comparison of PBL heights from Lidar and WRF at the CCNY grid during 2007



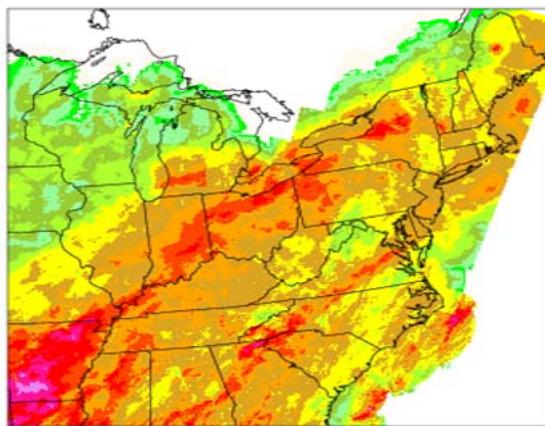
Data are from 1000 to 1300 hrs (EST) with 1-to-1 line and best fit

# Precipitation

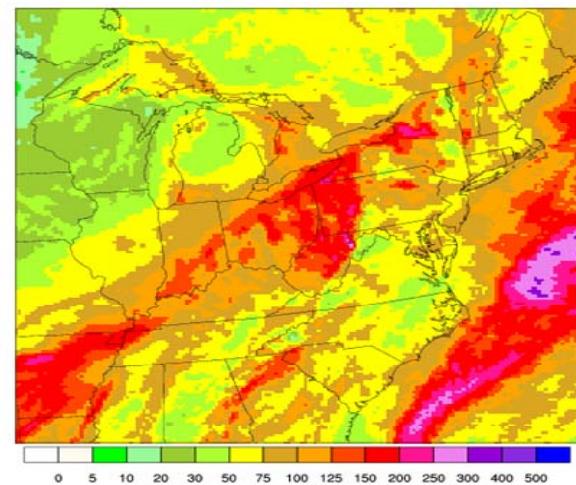
- Obtained NCEP gridded stage 4 precipitation data from measurements
- Compared against WRF estimate on a monthly accumulation basis
- Overall WRF performed fairly well over non-summer months, in terms of amount and pattern
- Over the months of April through September, WRF over-predicted precipitation amounts, except for August for which the model is found to under-predict the precipitation because of passage of Hurricane Dean in late August

# Comparison of precipitation based on measured (Stage -4) and predicted (WRF) for the month of January 2007

**Stage4 Monthly Precipitation (mm) 200701**

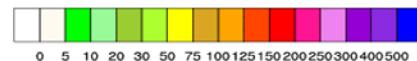
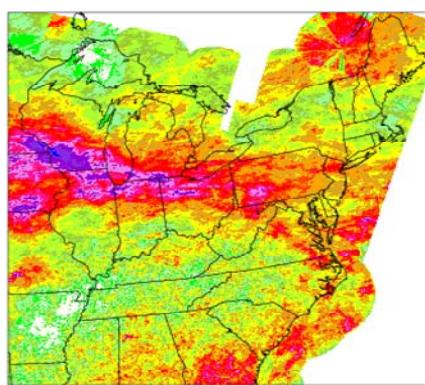


**WRF Monthly Precip (mm) for 200701**

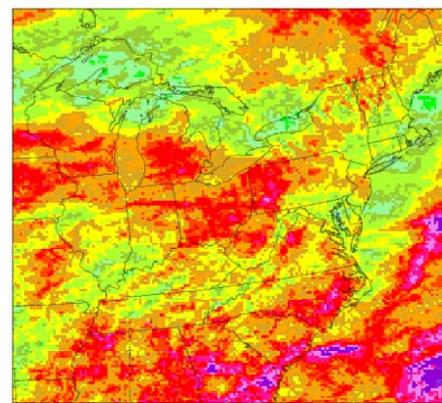


# Comparison of precipitation based on measured (Stage -4) and predicted (WRF) for the month of August 2007

Stage4 Monthly Precipitation (mm) 200708



WRF Monthly Precip (mm) for 200708



# Summary and Conclusions

- WRF simulations shows good comparison with NWS-TDL surface-based measurements
- Similarly good comparison was noted with CASTNet data
- WRF captured the cloud coverage pattern when compared with satellite-based data
- WRF simulated Low level jets (LLJ) and compares well with wind profiler data
- WRF based estimates of Planetary Boundary Layer (PBL) heights compared well with Lidar-based PBL heights at New York City location
- WRF simulated precipitation patterns are found to match well with measurements