

# Evaluation of real-time air quality and weather predictions using WRF-Chem

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# Overview

- Real-time model set-up
  - Discuss same domain for several field programs
- Model evaluation results
  - Meteorological evaluation
  - Chemistry model evaluation
- Current modeling activities at NOAA

# Field Programs

## ICARTT/NEAQS 2004\*

- AIRNow O<sub>3</sub> monitors (~340)
- AIRNow PM<sub>2.5</sub> monitors (~120)
- Speciation Trends Network (72 monitors)
- NOAA P3 Aircraft
- NOAA DC-3 Airborne Ozone Lidar
- NOAA Research Vessel Ronald H. Brown

\*International Consortium for Atmospheric Research on Transport and Transformation / New England Air Quality Study

**RV Ronald H. Brown**



# ICARTT/NEAQS 2004

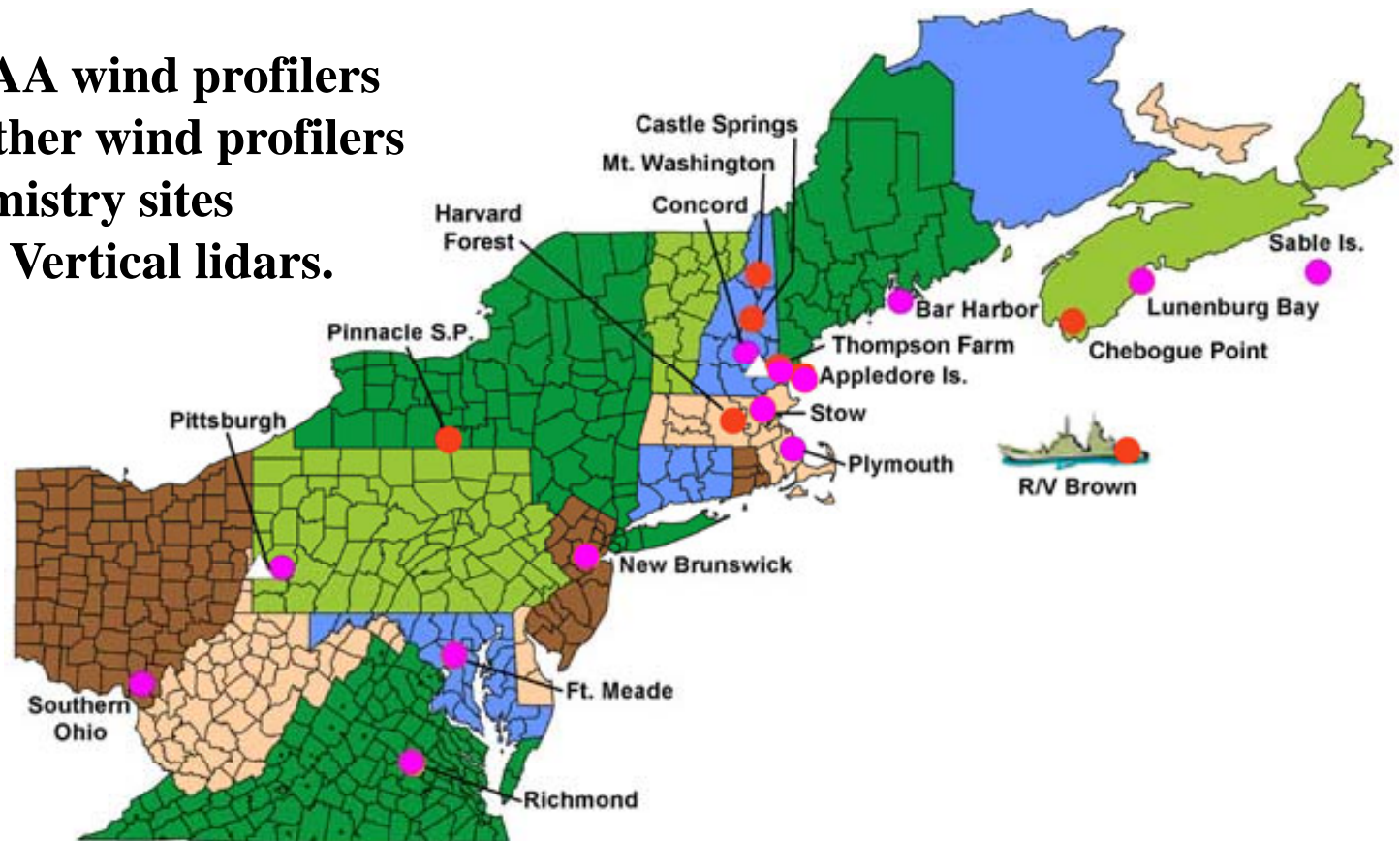
## 2004 surface network

**Pink:** NOAA wind profilers

**Yellow:** Other wind profilers

**Red:** Chemistry sites

**Triangles:** Vertical lidars.



# TEXAQS 2006

## Surface Meteorology and Chemistry Obs.

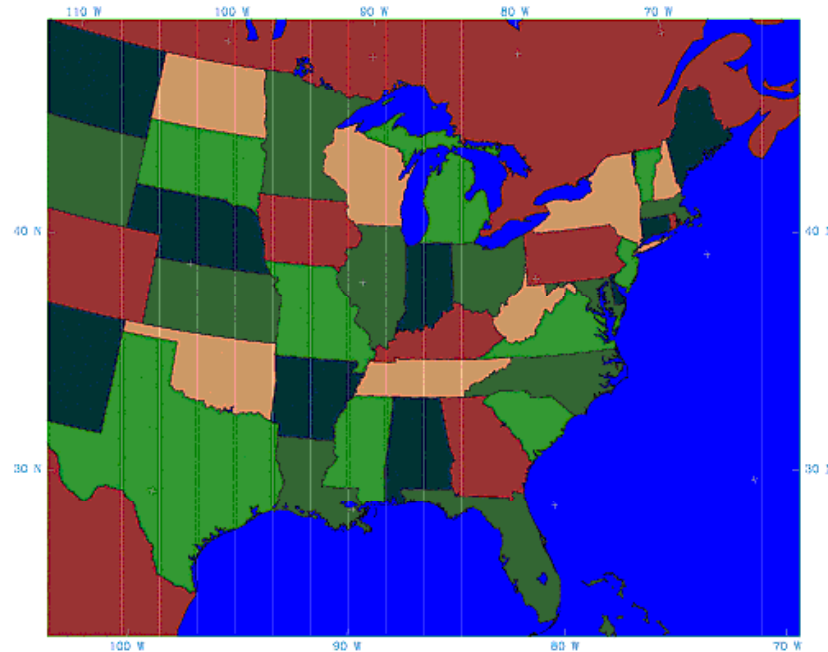
<http://www.etl.noaa.gov/programs/2006/texaqs/verification/>

- Surface Meteorology:  
wind speed and direction,  
temperature,  
humidity,  
pressure,  
precipitation,  
solar and net radiation
- Surface Chemistry:  
Ozone:  $O_3$ ,  
Fine particles:  $PM_{2.5}$ ,  
Nitrous Oxides:  $NO_x$ ,  
Carbon Monoxide:  $CO$ ,  
Sulfur Dioxide:  $SO_2$



## 2004/2006 real time forecast domain

- 27-km horizontal grid spacing, 110 x 134 x 35 grid points, dt = 120 s
  - ~ 1.5 h on 64 intel processors for 36 h forecast
  - Made available online for immediate use
- Historical - originally used in NEAQS 2002 to compare w/ MM5-Chem)

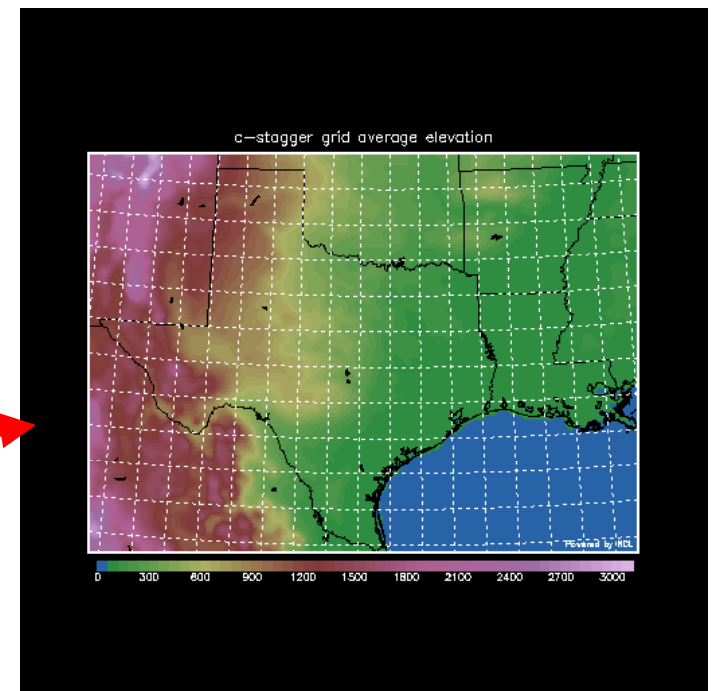
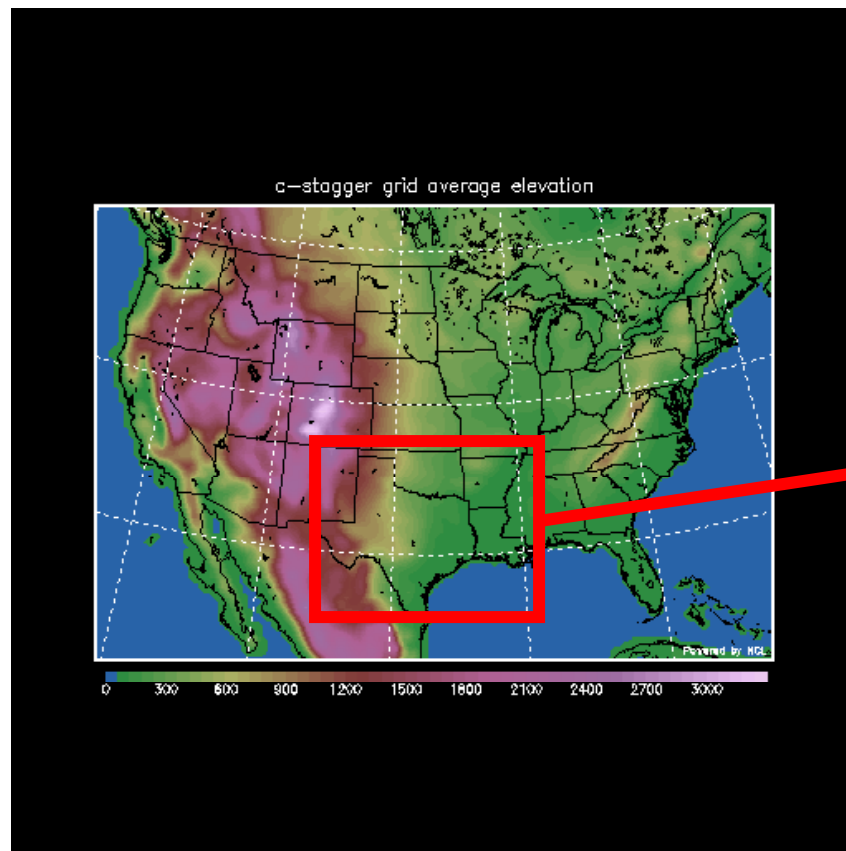


# 2004/2006 real time WRF-Chem settings

- Table 1. Model configuration options and parameterizations used in the WRF-Chem real-time air quality forecasts using 27-km horizontal grid spacing.
- Advection scheme 5<sup>th</sup> horizontal /3<sup>rd</sup> vertical
- Microphysics NCEP 3-class simple ice
- Longwave radiation RRTM
- Shortwave radiation Dudhia
- Surface layer Monin-Obukhov (Janjic Eta)
- Land-surface model RUC\_LSM (Smirnova et al. 1997)
- Boundary layer scheme Mellor-Yamada-Janjic 2.5 TKE
- Cumulus parameterization Grell and Devenyi, 2002
- Chemistry option RADM2 (Stockwell et al. 1990)
- Dry deposition Weseley, 1989
- Biogenic emissions BEIS 3.11 (v 2.03)
- Anthropogenic Emissions NEI 1999 v 3.0
- Photolysis option Madronich, 1987
- Aerosol option MADE/SORGAM

# Real Time AQ Forecast Domain

- Also ran 12km domains for each field program
  - e.g., 12-km nested domain used in TEXAQS 2006

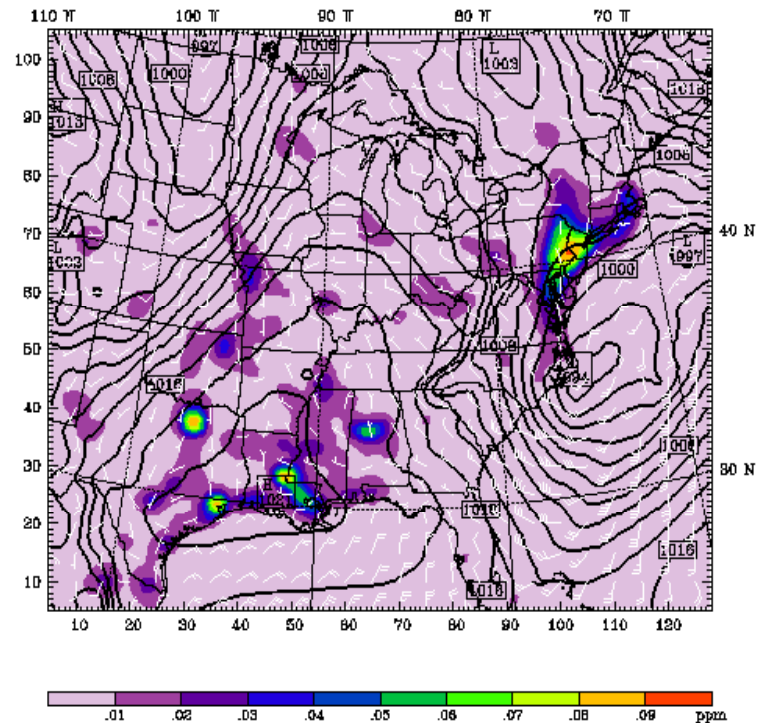




# Real time WRF-Chem

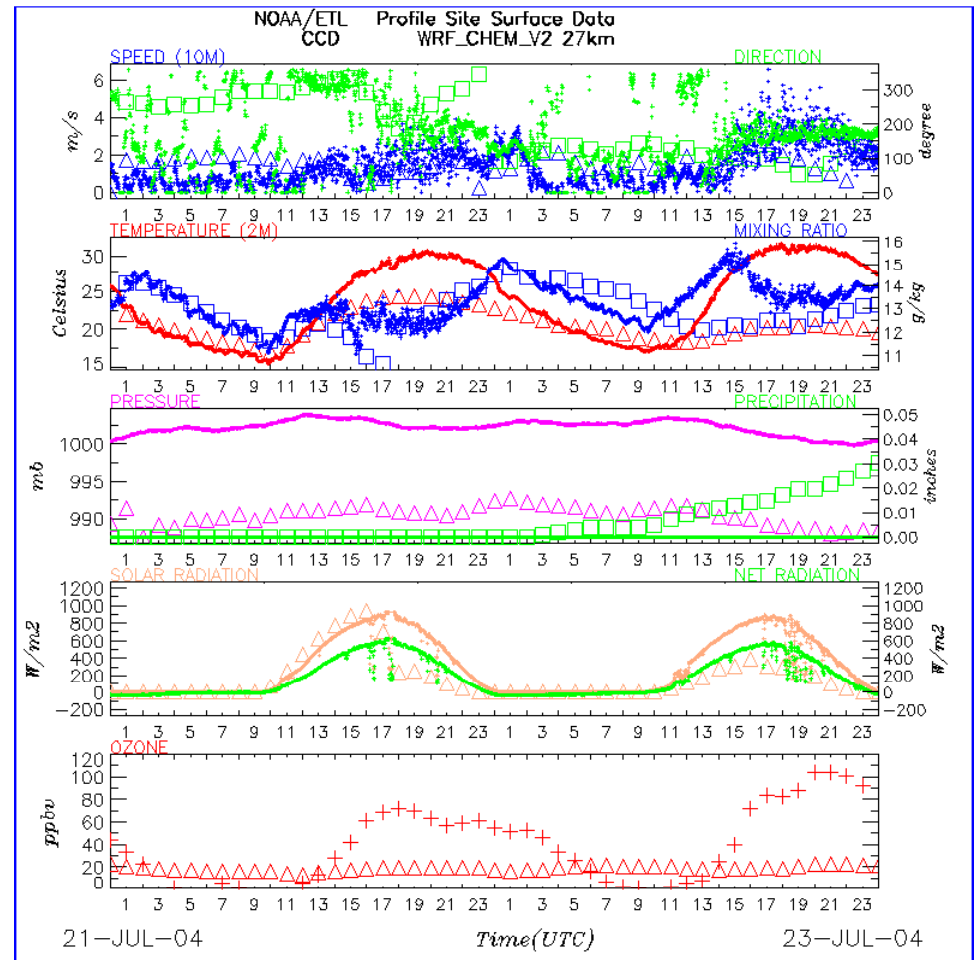
- Data made available in real time via Web
  - Surface fields
    - MP2.5
    - Surface winds
  - Also plots of:
    - Ozone, CO, etc.
    - Precipitation, standard pressure levels met., clouds

NOx (NO + NO<sub>2</sub>) at level 1  
Fcst: 36.00  
Init: 0000 UTC Mon 30 Jan 08  
Valid: 1200 UTC Tue 31 Jan 08 (0500 MST Tue 31 Jan 08)



# Real time WRF-Chem

- Other example of data available on web pages
  - Many standard meteorological fields
  - Some chemical fields
  - Useful for meteorological evaluation



Observations from at Concord, NH

# Real-time WRF-Chem

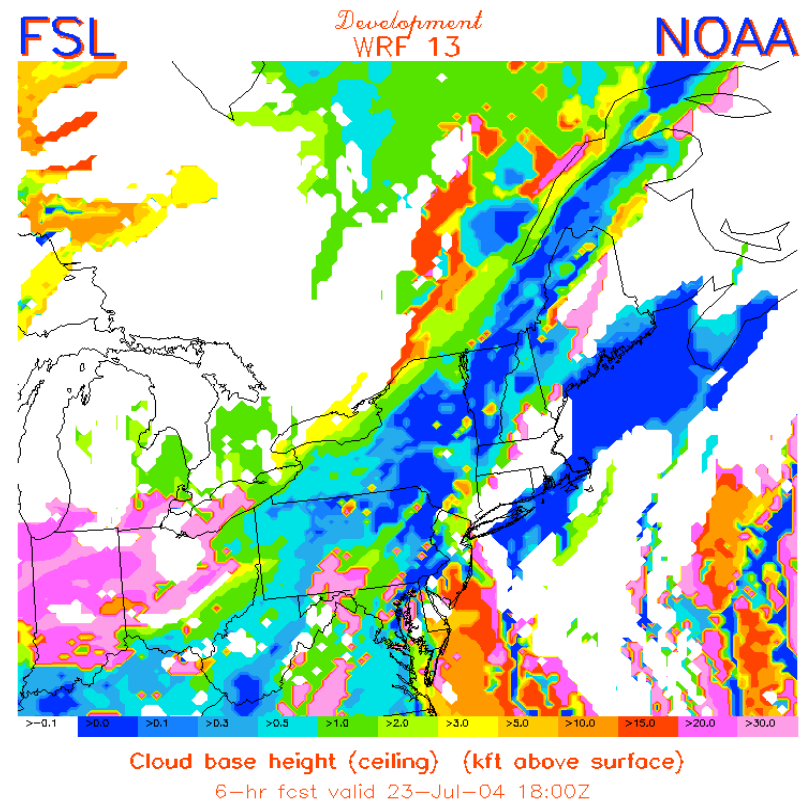
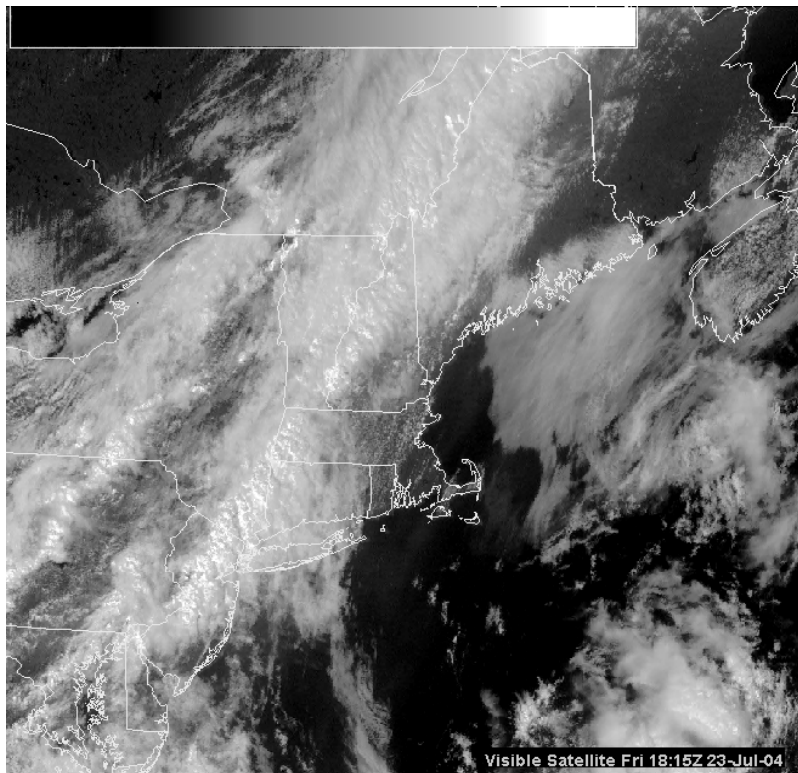
- Meteorological Evaluation (Jim Wilczak)

Real-time model verification product:

[www.etl.noaa.gov/programs/2004/neaqs/verification](http://www.etl.noaa.gov/programs/2004/neaqs/verification)

# Meteorological Evaluation

## WRF cloud forecasts



# Meteorological Evaluation

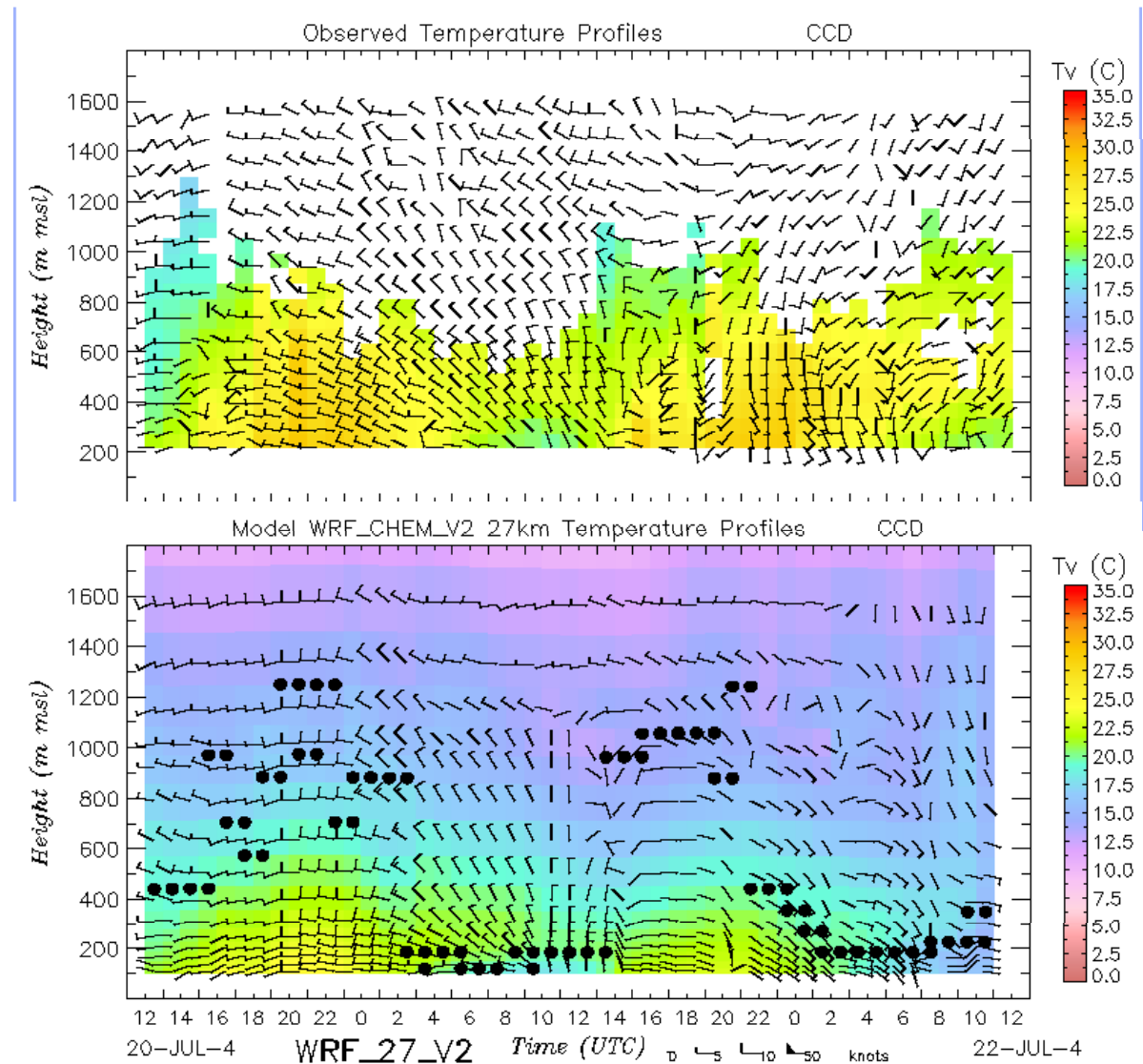
## LIDAR profile observations vs model forecast at location

- Winds:

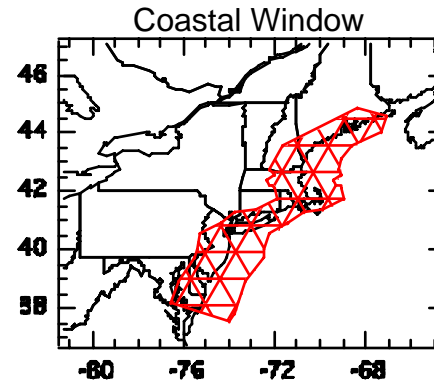
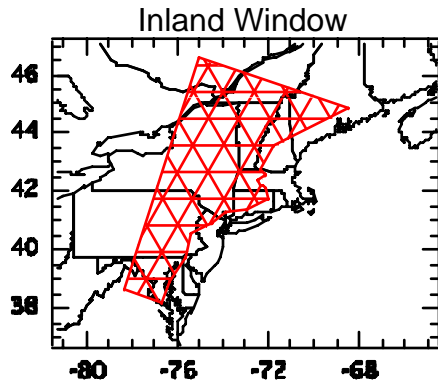
- Daytime: close
- Night: not too good

- Temperature:

- MYJ parameterization appears to be too cool
- Other PBL parameterizations give different results
- Important to initialize soil moisture correctly



# Meteorological evaluation - upper air profiles

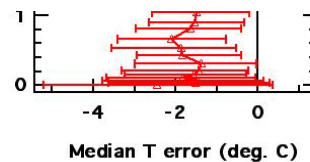
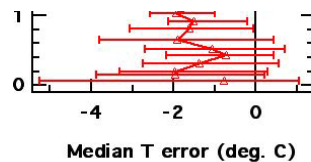
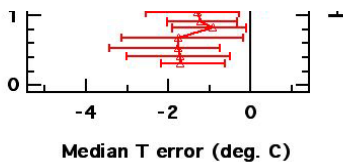


Window    data coverage  
Inland, daytime = 11%  
Coastal, daytime = 19%

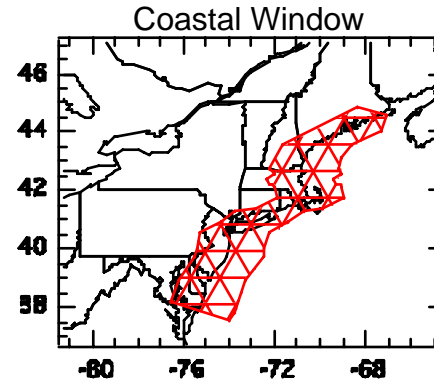
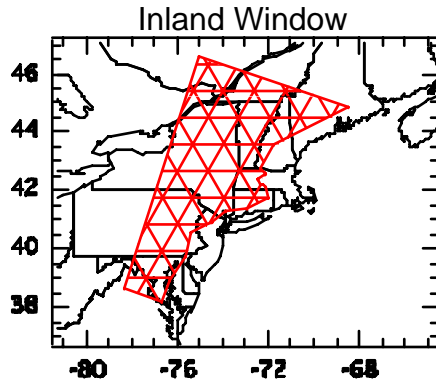
WRF model,  
T profiles

Median model error

(MYJ PBL too cool  
during daytime)



# Meteorological evaluation - upper air profiles

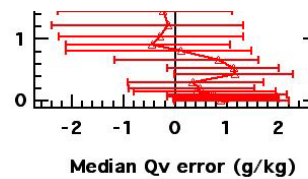
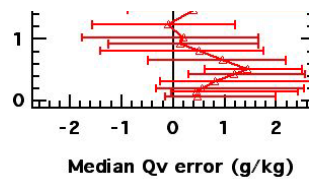
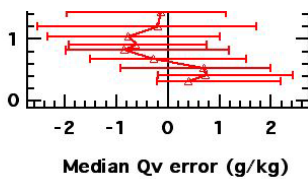


Window    data coverage  
Inland, daytime = 11%  
Coastal, daytime = 19%

WRF model,  
Mixing ratio profiles

Median model error

(MYJ PBL too humid  
during daytime)



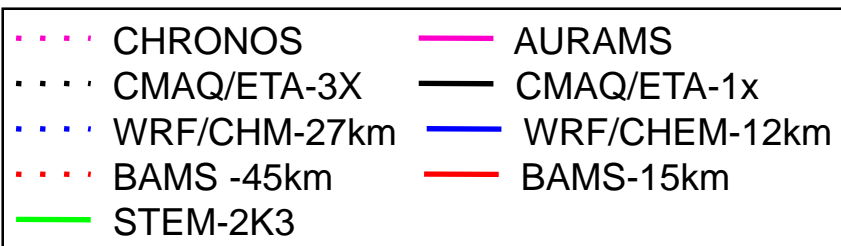
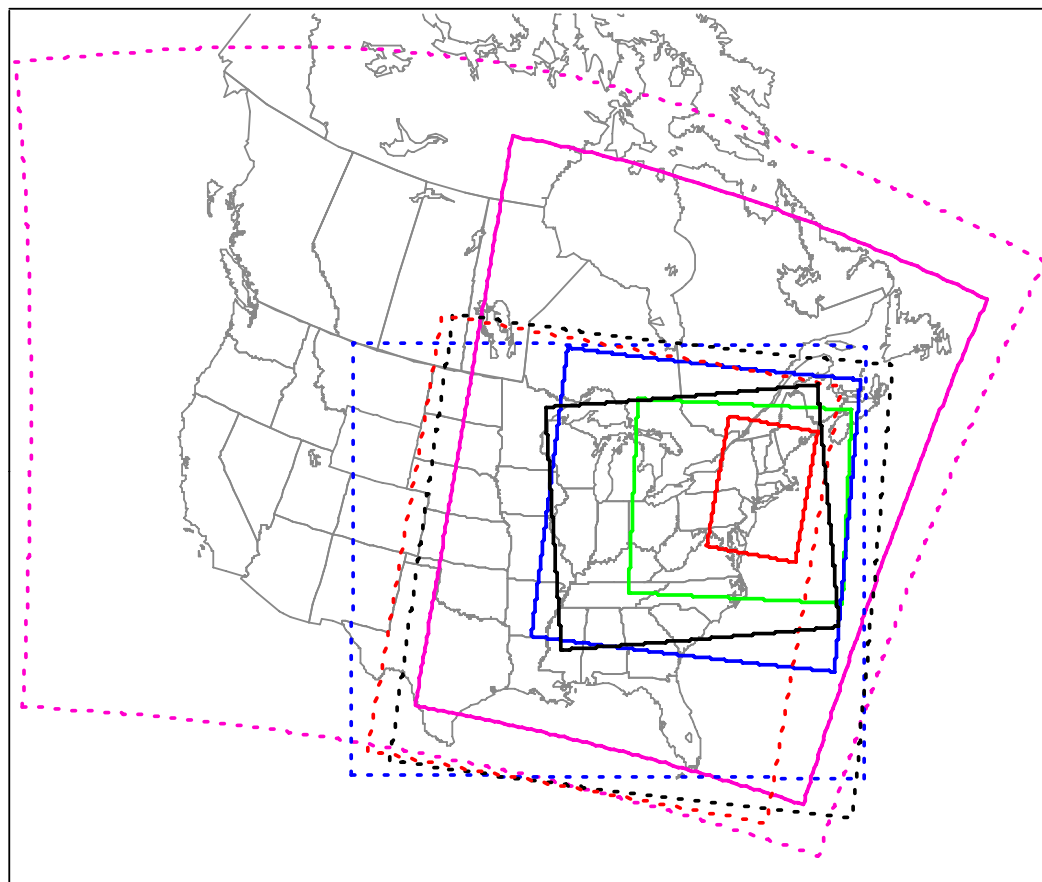
# Real-time WRF-Chem

- Statistical Evaluation (Stu McKeen)
  - Surface chemistry observations
  - Tropospheric chemistry observations



TEXAQS 2004

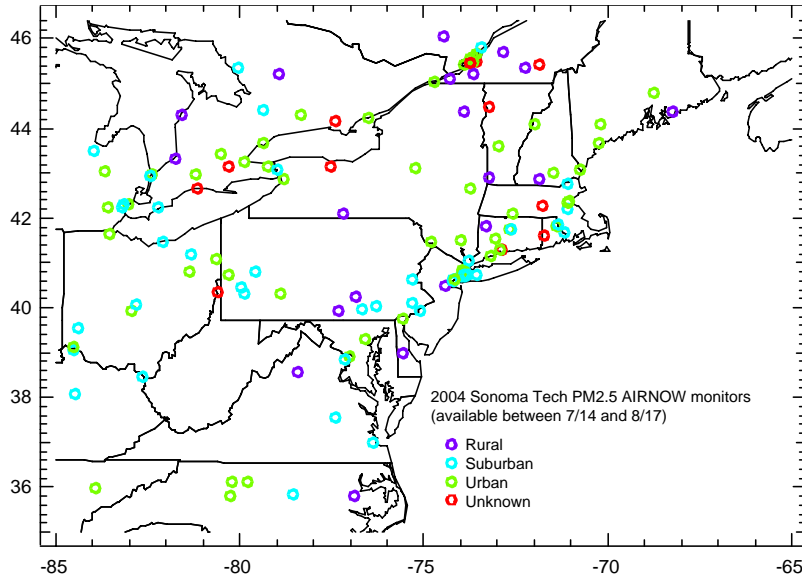
## Models Used in the ICARTT/NEAQS-2K4 Evaluations



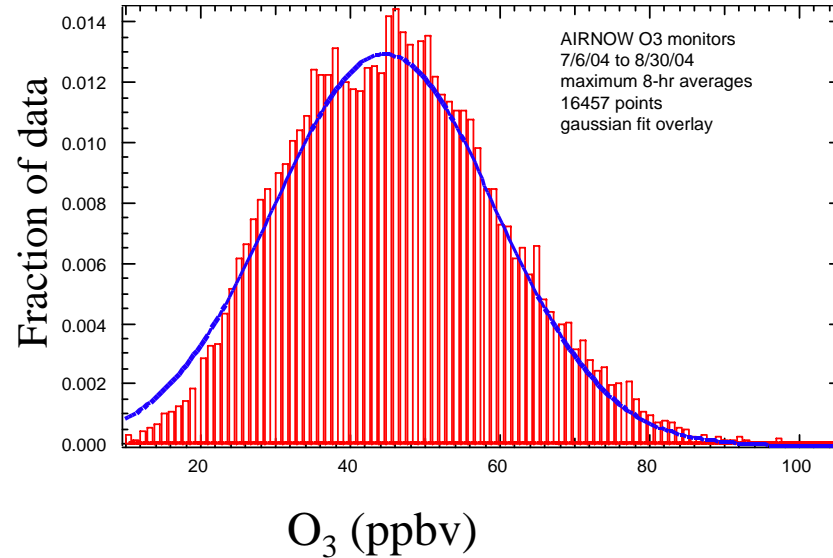
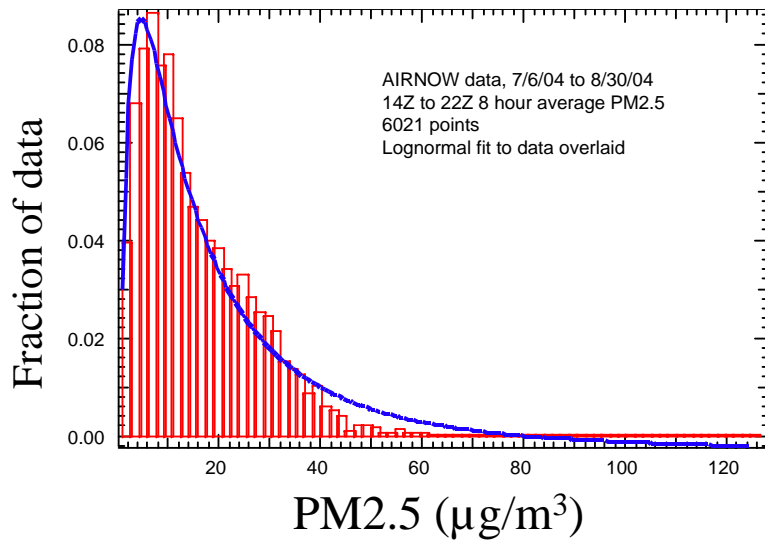
<u>Model:</u>	<u>Anthropogenic Emission Inventory:</u>
AURAMS - 42km	Canadian National Inv. (1990, 1995)
CHRONOS - 21km	
CMAQ/ETA(1x) - 12km	
CMAQ/ETA(3x) - 12km(*)	NEI-99, 2001, grown to 2004
BAMS - 45km	
BAMS - 15km	
WRF/CHEM-1 - 27km	NEI-96
WRF/CHEM-2 - 27km	
WRF/CHEM - 12km(*)	NEI-99
STEM(2K3) - 12 km	

Red indicates PM<sub>2.5</sub> forecasts available  
 (\*) Indicates a retrospective run

## PM2.5 Monitors - AIRNow network (2004)



- 118 TEOM monitors
- 10 am to 6 pm LDT averages
- No spatial interpolation
- **Log-transformed statistics for PM2.5**
- Only days with complete model overlap
- Only 00Z forecasts analyzed so far



# ICARTT/NEAQS-2004: Comparing equivalent PM2.5 and O<sub>3</sub> statistics

## Statistics for 6 Air Quality Forecast Models with 118 AIRNOW PM2.5 monitors (7/14/04 through 8/17/04 - 34 days)

### PM2.5 (log stats)

Statistics for 14Z to 22Z 8-hr averages, based on 00Z forecasts only.

Medians of 118 monitor comparisons

Institute, model, horiz. resolution	r coefficient	Modl/Obs ratio	RMSE (factor)	Skill (%)
NOAA FSL, WRF/Chem-1, 27km	0.42	1.17	2.19	33%
<b>NOAA FSL, WRF/Chem-2, 27km</b>	<b>0.65</b>	<b>0.79</b>	<b>1.79</b>	<b>64%</b>
MSC Canada, CHRONOS, 21km	0.67	0.77	2.14	53%
MSC Canada, AURAMS, 42km	0.49	0.85	2.16	58%
U of Iowa, STEM, 12km	0.65	1.12	1.95	70%
CMAQ/ETA, 12 km	0.65	0.75	2.01	61%
6-model Ensemble	0.75	0.86	1.76	75%

### O<sub>3</sub> (linear stats)

Statistics for maximum 8-hr averages, (00Z forecasts).

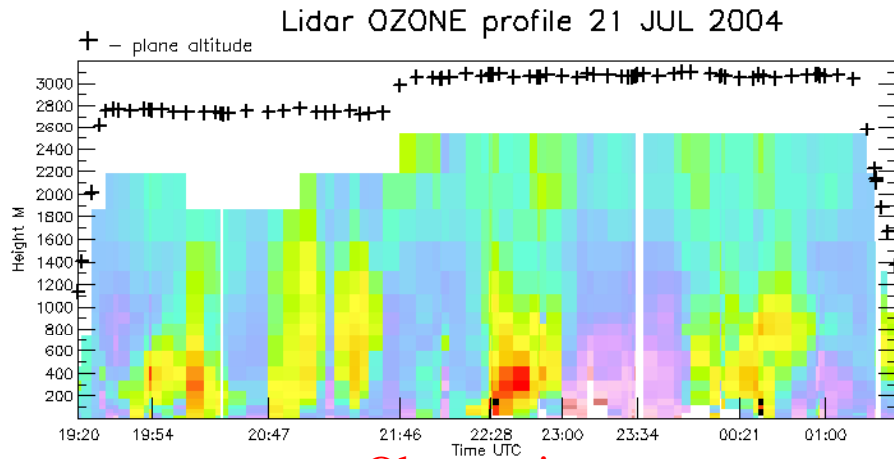
Medians of 342 monitor comparisons

r coefficient	Mean bias ppbv	RMSE (ppbv)	Skill (%)
0.67	14.3	20.9	24%
<b>0.73</b>	<b>3.4</b>	<b>11.57</b>	<b>61%</b>
0.68	17.0	23.2	16%
0.54	5.9	16.2	27%
0.60	26.4	31.	2%
0.63	13.4	17.9	24%
0.76	10.2	15.0	47%

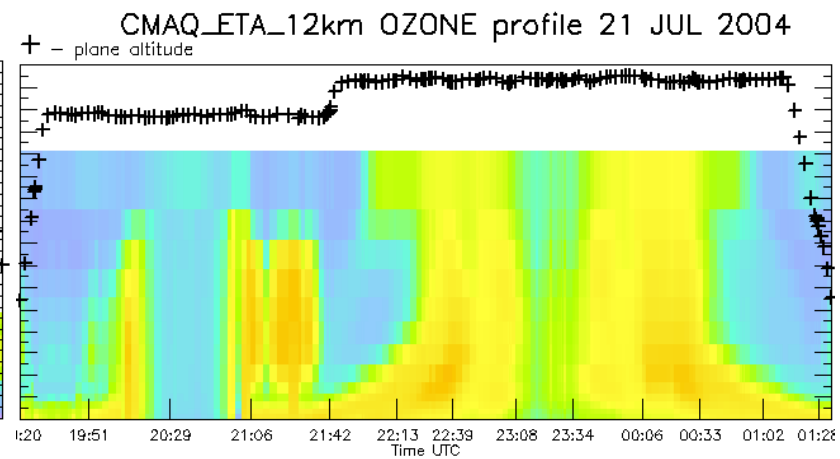
WRF-Chem version 2 improves forecast correlation, reduces ozone bias  
 - improved emissions, fixed “features” in model  
 PM2.5 ratio bias near 1! Had expected worse ratio bias

# NOAA DC-3 Ozone curtains: observations and model forecasts

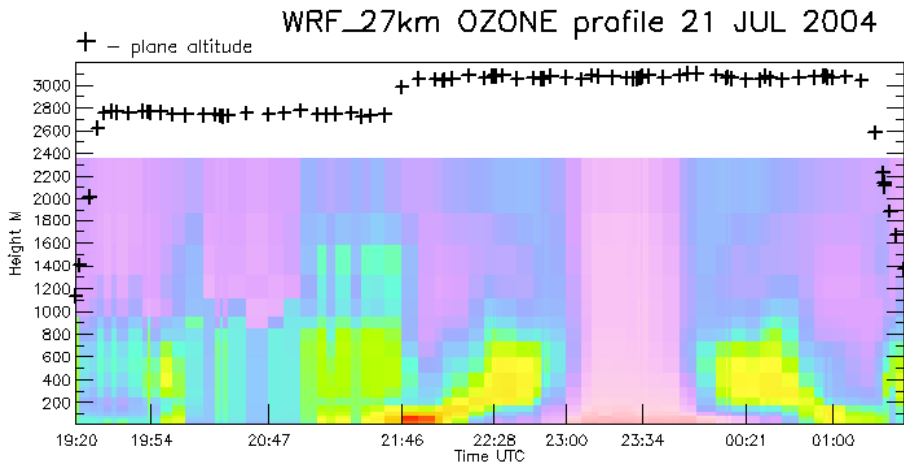
## July 21, 2004



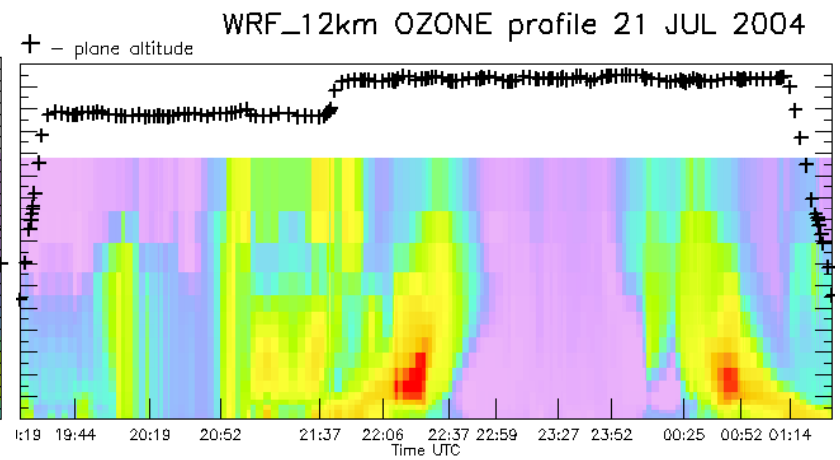
Observations



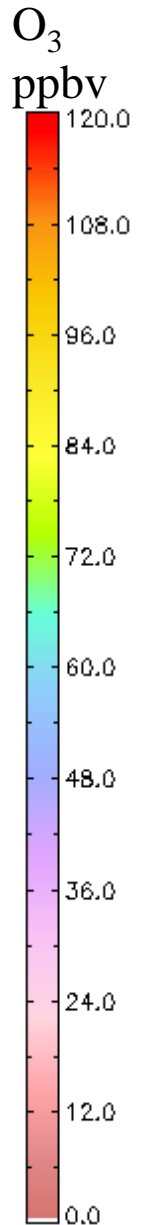
CMAQ/ETA offline Model



WRF-Chem MYJ (2.5) PBL scheme

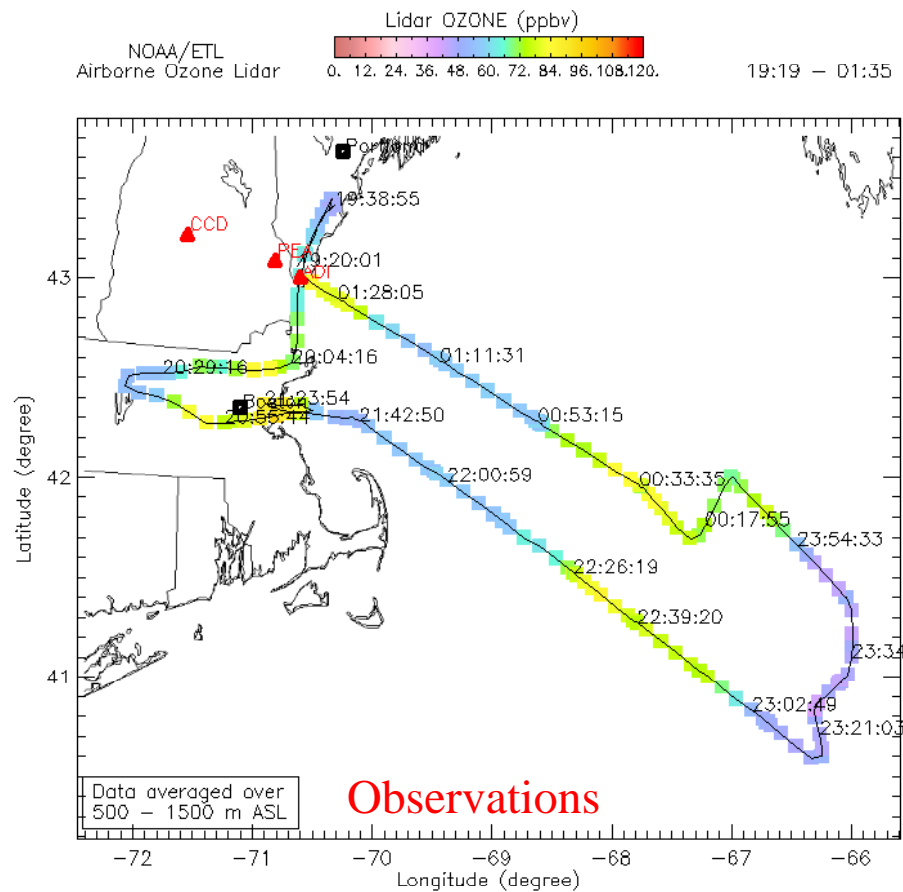


WRF-Chem YSU PBL scheme



# NOAA DC-3 Airborne Ozone Lidar Average PBL Ozone concentration

Plane position 21 JUL 2004



TEXAQS 2006

Real-time Model Forecasts Collected by CSD during TexAQS-2006  
And used within the surface-network and aircraft evaluations:

12km online WRF/Chem (NOAA/GSD) - NEI-99 (March 2004 release)  
36km online WRF/Chem (NOAA/GSD) - NEI-99 (March 2004 release)  
12km offline CMAQ/WRF-NMM (NCEP) - NEI-2001, Pouliot et al.  
21km offline Canadian CHRONOS model (GEMS) - NEI-2001  
28km offline Canadian AURAMS model (GEMS) - NEI-2001  
5km offline Baron AMS MAQSIP model (MM5) - NEI-2001, Vukovich et al.  
15km offline Baron AMS MAQSIP model (MM5) - NEI-2001, Vukovich et al.  
20km offline University of Iowa STEM model (MM5, WRF)- NEI-2001, Vukovich et al.

Applications for multi-model evaluations:

Model versus Model Evaluations

Ensemble Forecasts

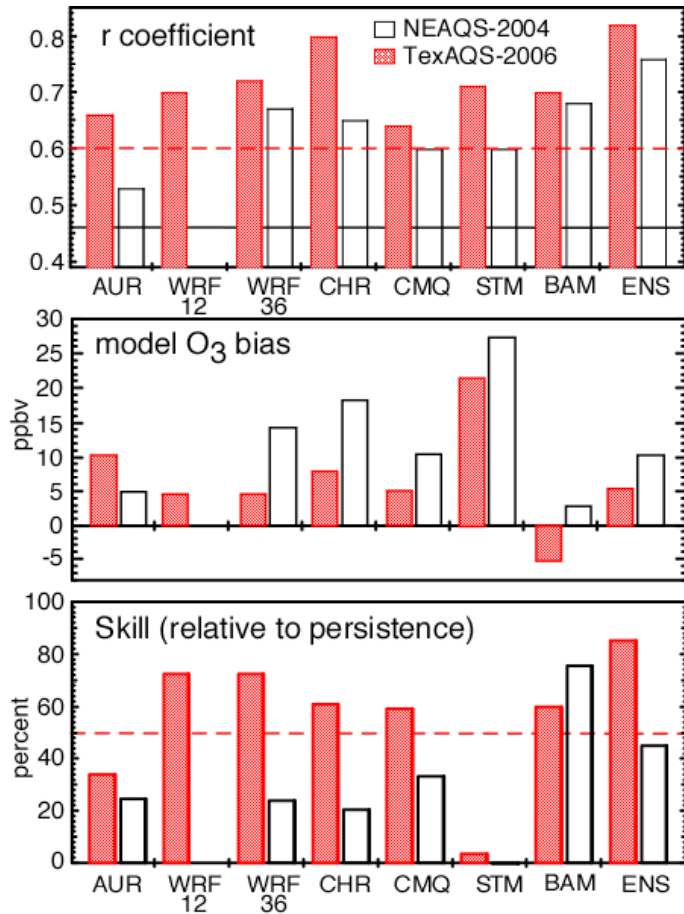
Emissions Verification



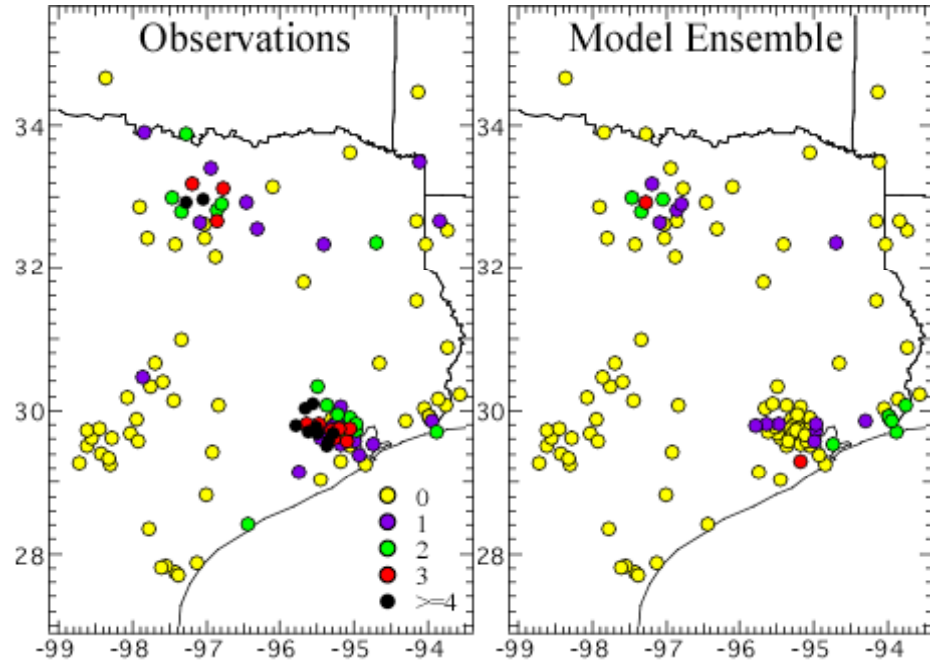
# Review: AQ forecast models versus AIRNow surface network

## 8-hr maximum average O<sub>3</sub>

### Standard Statistics



### Number of days 8hr max > 85 ppbv



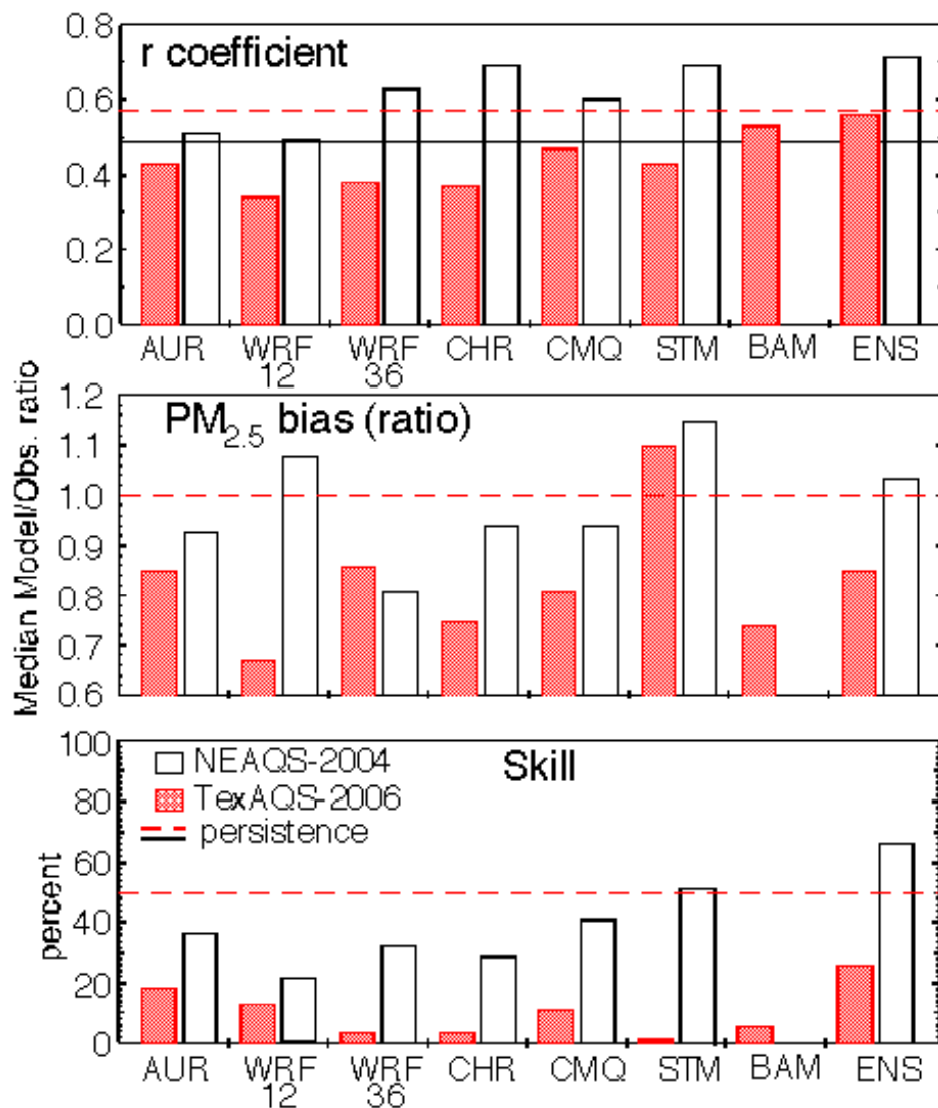
Ensemble of 7 models yields best bulk statistics

TexAQ5-2006 forecasts much better than 2004

Number of days > 85 ppbv underpredicted in 2006, particularly in Houston

## Review: AQ forecast models versus AIRNow surface network

### 24-hr avrg.PM2.5



PM2.5 (24-hr) forecasts show less skill than for O3

2006 TexAQS PM2.5 forecasts perform worse than 2004.

Most models biased low (~15%) during TexAQS-2006

## The NOAA WP-3D Aircraft Platform during the 2004 and 2006 field studies



### Payload:

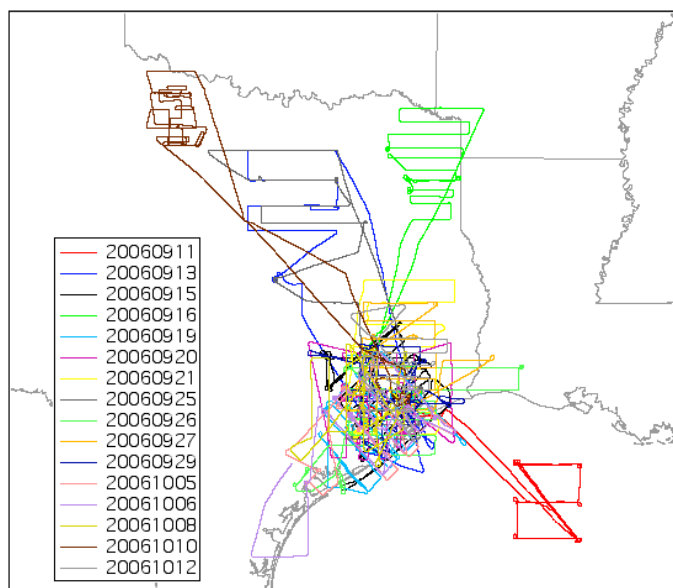
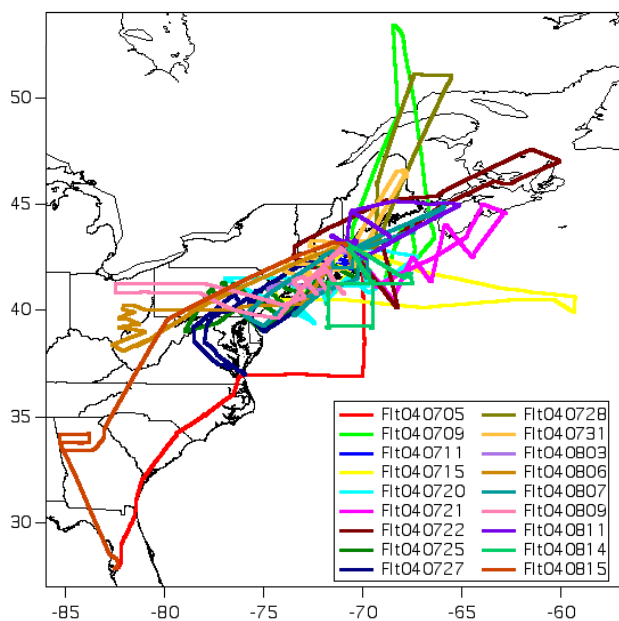
- ~ 22 gas-phase at (1 to 10 sec res.)
- 6 PM2.5 constituents
- PM2.5 size distributions
- Actinic Flux and Radiation
- 1 second meteorology variables

### Flight Patterns:

- ~ 80% of time 300 and 600 m AGL
- 0 to 6 km vertical profiles
- ~ 70% of time from 10am to 4 pm LT
- Upwind/Downwind of Urban Plumes

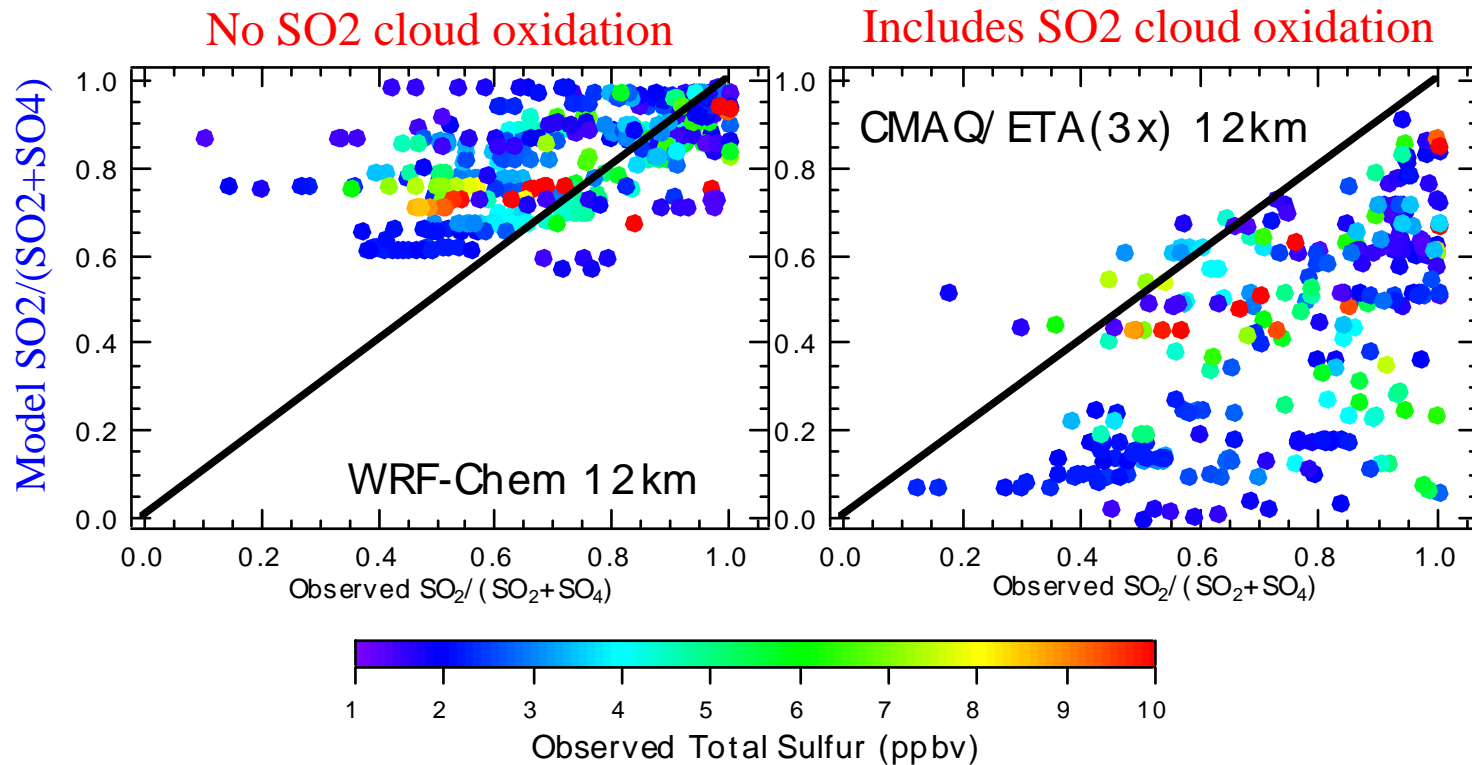
### WP-3D evaluation web page:

<http://www.esrl.noaa.gov/csd/2006/modelevel/>



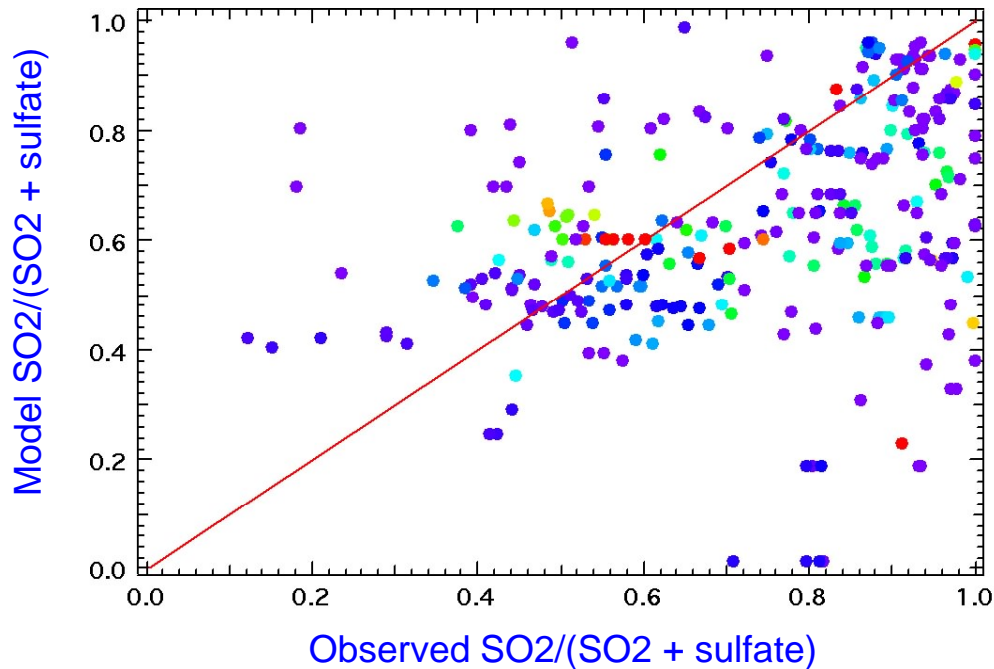
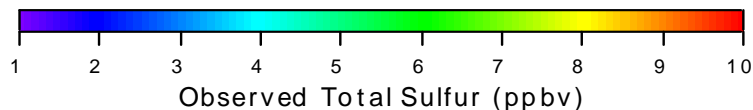
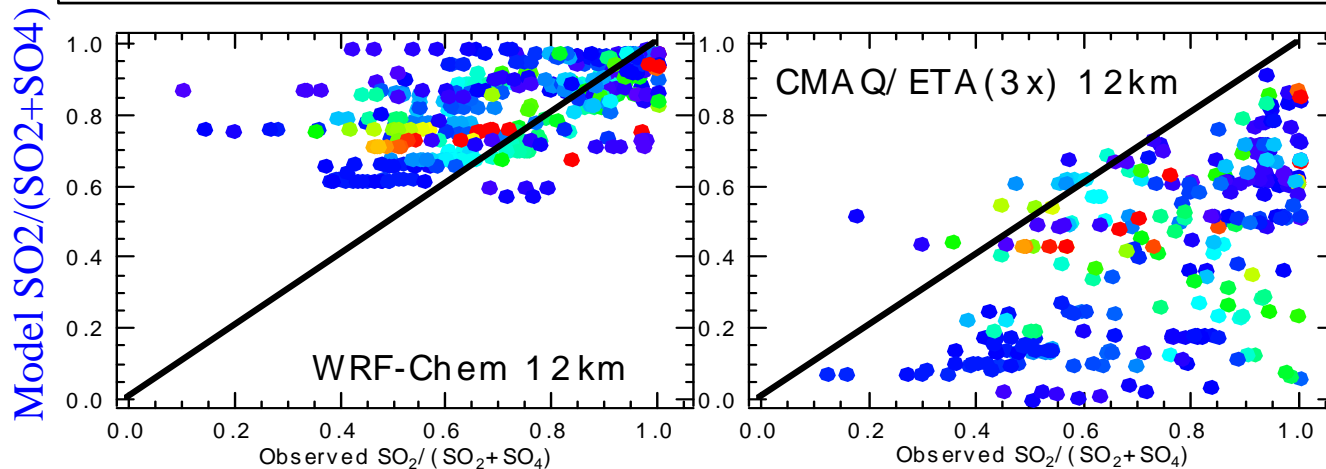
## Comparing SO<sub>2</sub> oxidation rates, Models versus Obs.

Inland, 410 - 670 meter, 11:00 am to 4:00 pm LT, 7 flights 7/15/04 - 7/28/04)



Models without cloud oxidation under-predict SO<sub>4</sub> and SO<sub>2</sub> oxidation  
Models with cloud oxidation over-predict SO<sub>4</sub> and SO<sub>2</sub> oxidation

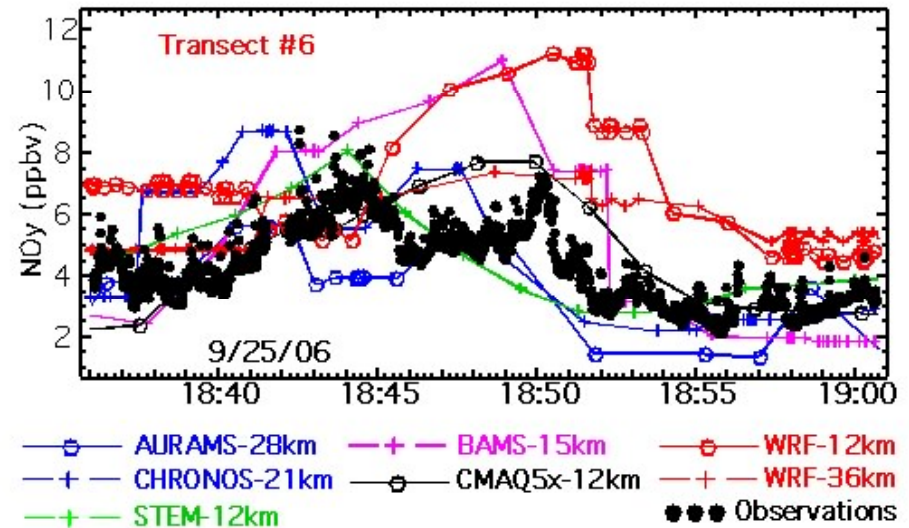
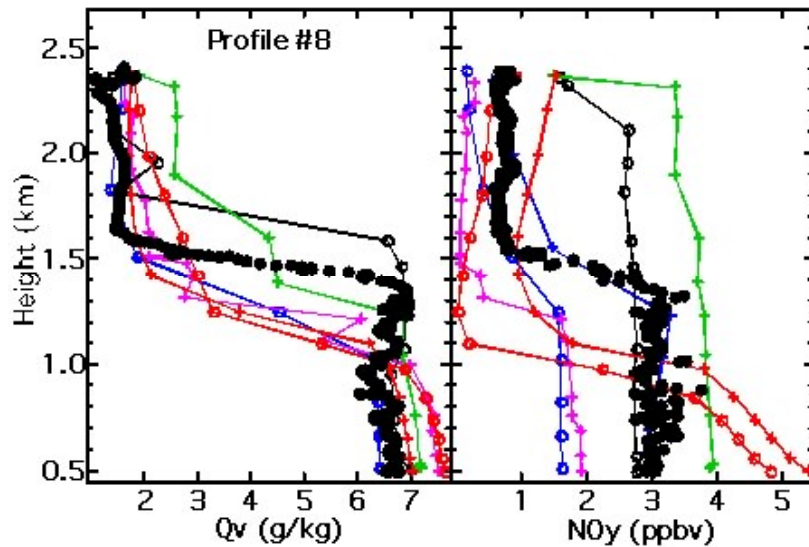
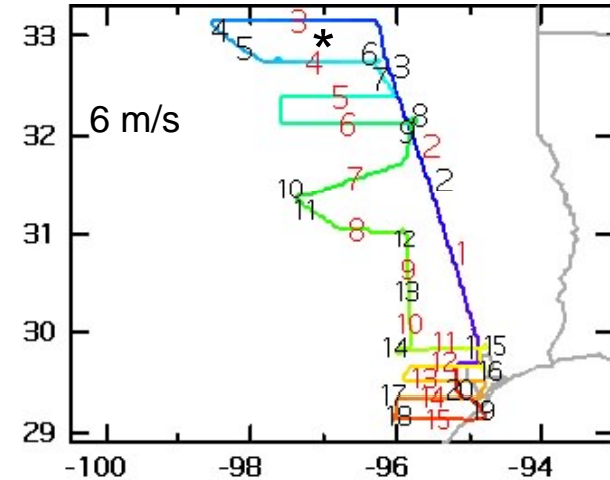
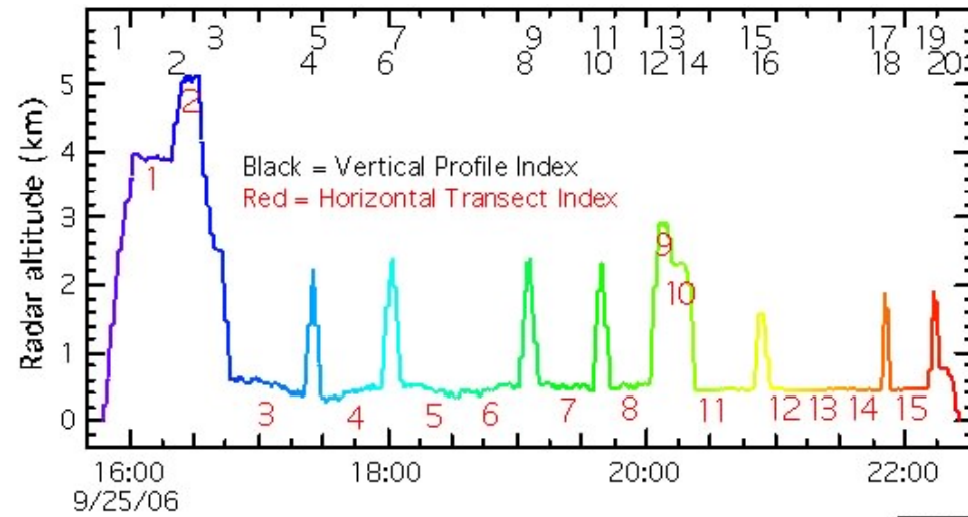
WRF/Chem version 3.0 GOCART aerosol - aqueous phase SO<sub>2</sub> oxidation



WRF/Chem version 3.0  
RACM-GOCART

Simple (instantaneous)  
Cloud Oxidation of  
SO<sub>2</sub> with H<sub>2</sub>O<sub>2</sub>

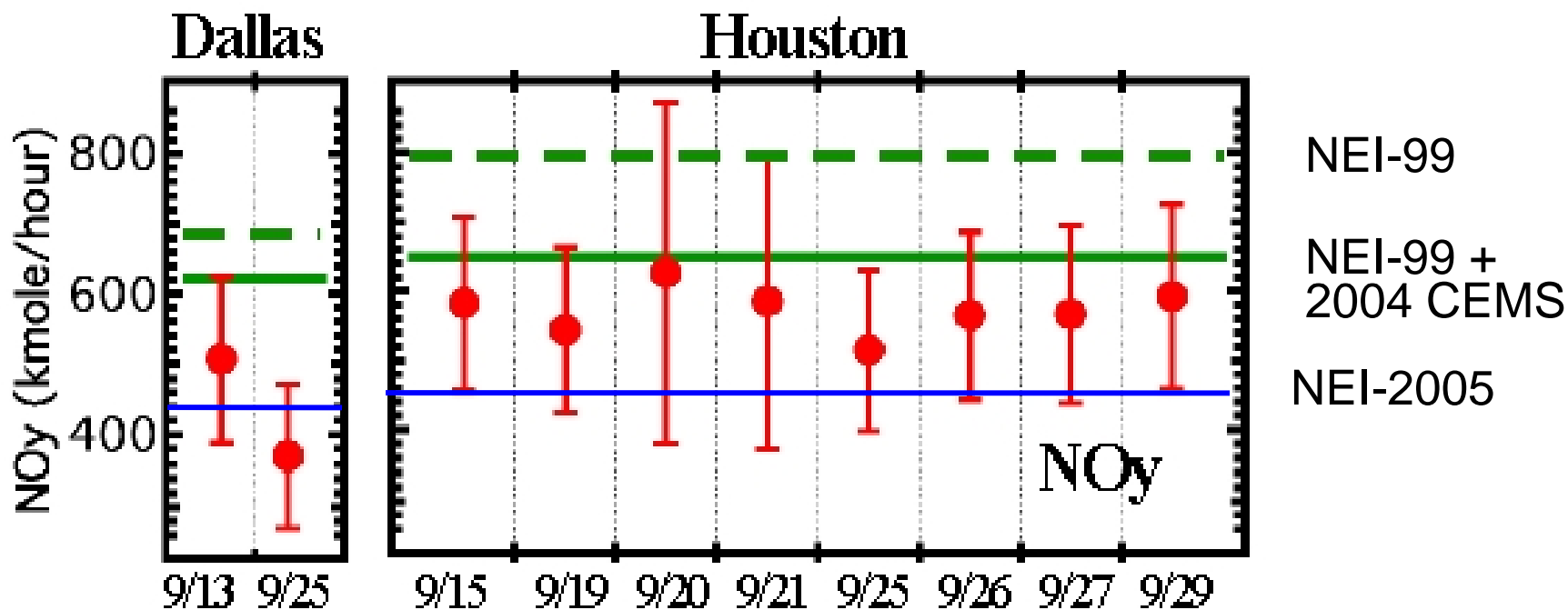
## TexAQS-2006, Upwind and Downwind Sampling of Houston and Dallas (Example of 9/25/06 flight, transect 80 km downwind of Dallas)



- AURAMS-28km      —+— BAMS-15km      —○— WRF-12km
- +— CHRONOS-21km    —○— CMAQ5x-12km    —+— WRF-36km
- +— STEM-12km        ●●● Observations

# Observed and Inventory Emission Estimates of NO<sub>y</sub> for Dallas and Houston:

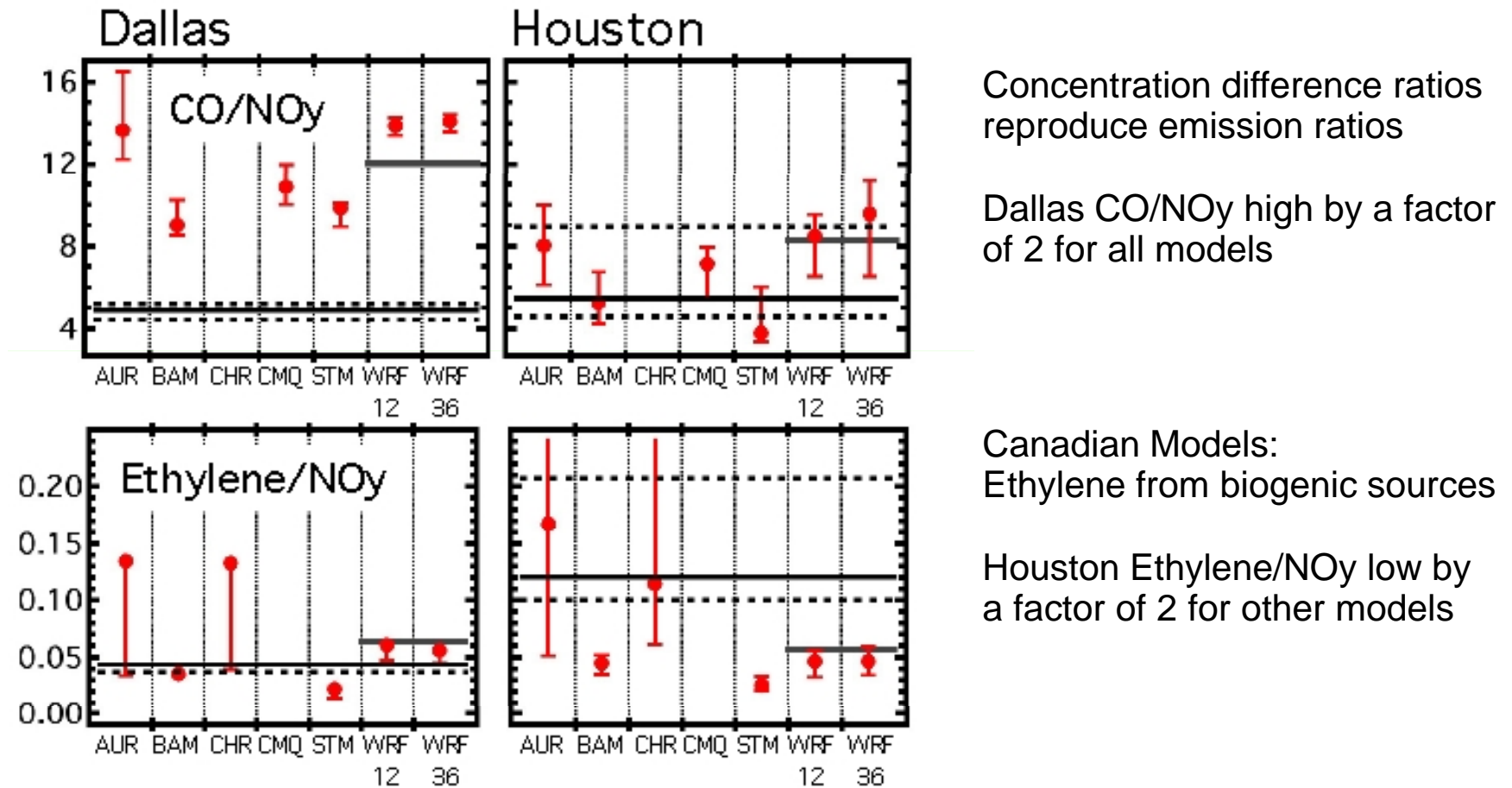
NO<sub>y</sub> 11:00 am LT emissions from Houston and Dallas  
Derived from upwind/downwind transects, and emission inventories



Uncertainty limits in observations include PBL and background uncertainties

Emission inventory from 11:00am to noon, LT (representative of daylight average)  
over pre-determined ~1000 km<sup>2</sup> domains

Model and Observed concentration difference ratios (and NEI-99 emission ratios)  
downwind (< 50 km) of Houston and Dallas



Red circles: Model median ratios (whiskers - central 2/3 of sorted distributions)

Black lines: Observed medians (dashed lines - central 2/3 of sorted distributions)

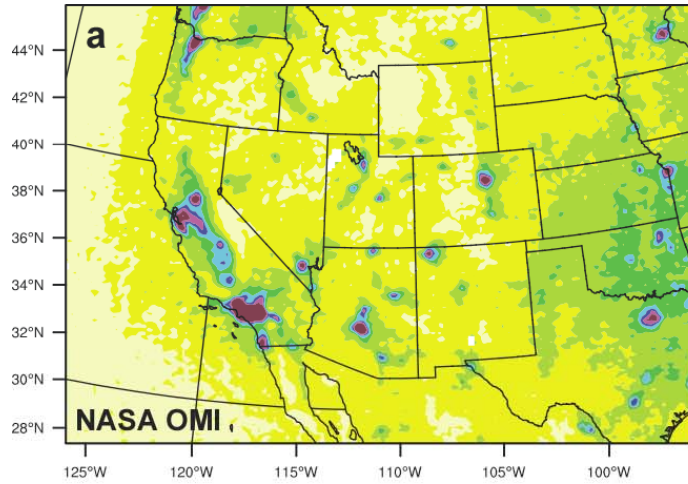
Gray lines over WRF/Chem models - From NEI-99 (used in WRF/Chem runs)



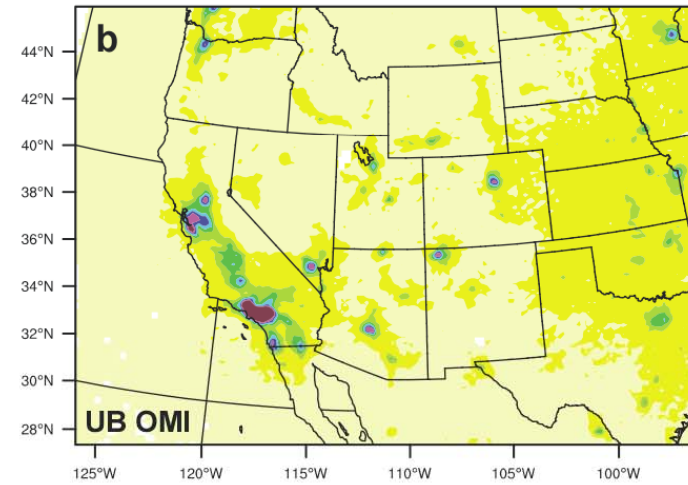
# OMI satellite NO<sub>2</sub> column comparisons

Summer of 2005 averages, 10:30 Local Time overpass

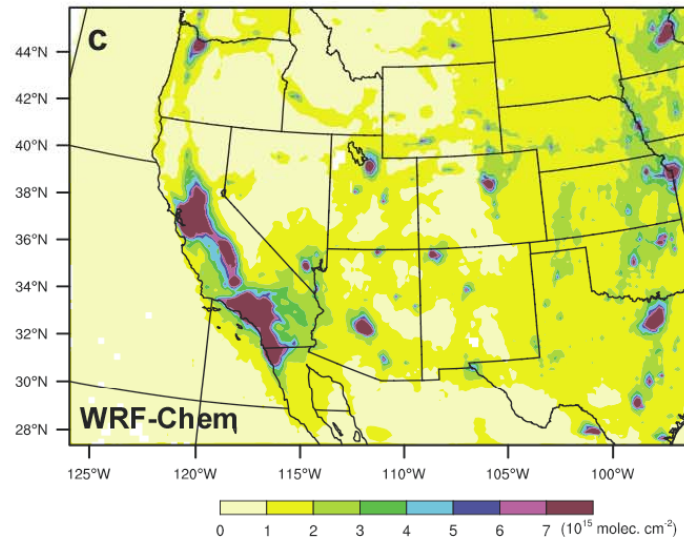
NASA retrieval



University of Bremen retrieval



WRF/Chem model



## Current real time

- a new domain
- a new grid spacing
- a new set of problems?

# Real Time AQ Forecasts

<http://ruc.noaa.gov/hrrr>

Every 6 h over the western US (as of Aug08)

Real-time fire information (GOES ABBA) to provide air quality guidance

Uses radar-enhanced RUC-DFI (Digital Filter Initialization) grids

atmospheric initial conditions, same as hourly NE Corridor HRRR.

Cycled chemistry variables, including:

Ozone,

PM 10 aerosol,

PM 2.5 aerosol.

Includes direct effect feedback from atmospheric aerosols

# Real Time AQ Forecast Domain

## HRRRchem domain:

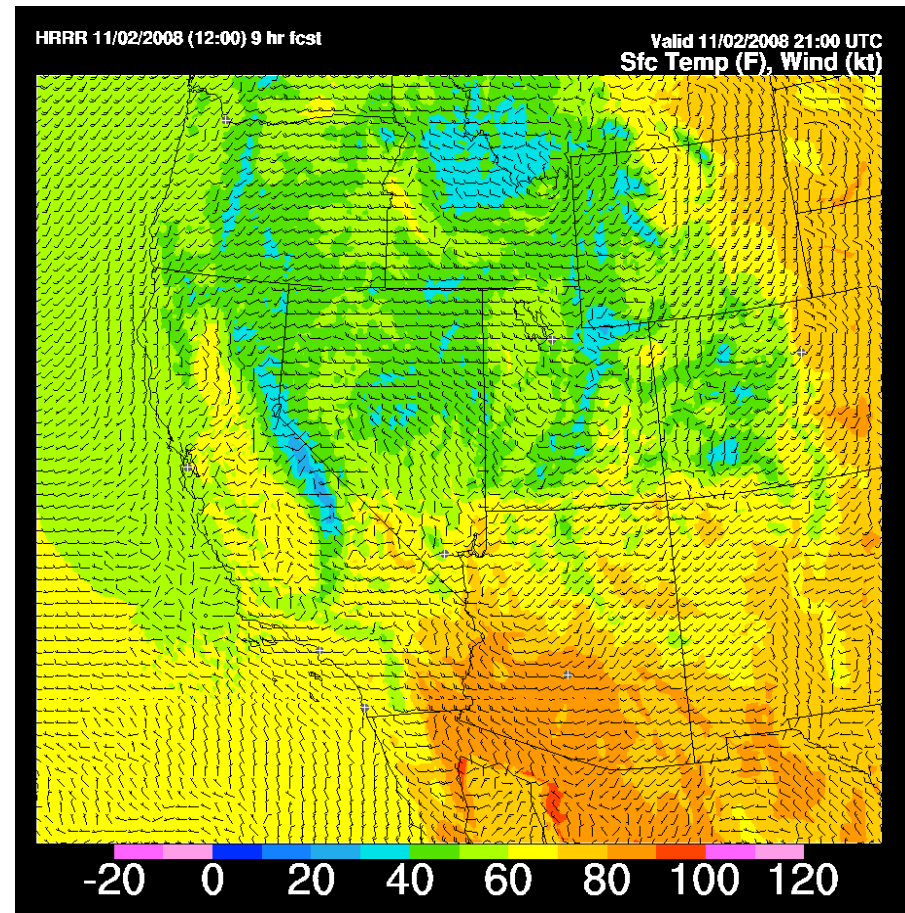
- 3 km horizontal grid
- 711 x 647 grid points
- 51 Vertical levels
- Vertical stretched

## Physics options:

- Thompson microphysics
- Goddard SW
- RRTM LW scheme
- RUC land surface
- MYJ TKE PBL scheme

## Chemistry options:

- RADM2/SORGAM
- Aerosol-Radiation feedback (direct effect)



# Real Time AQ Forecast: Wild Fire location

<http://cimss.ssec.wisc.edu/goes/burn/wfabba.html>

## Wildfire Automated Biomass Burning Algorithm (WFABBA)

half-hourly fire data for the Western Hemisphere.

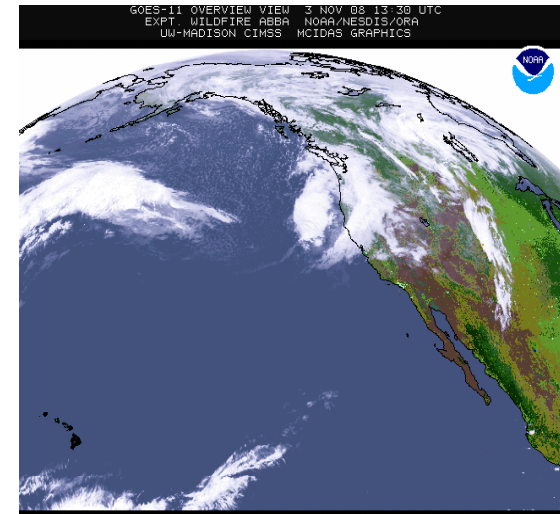
GOES-11 covers North America only.

GOES-12 provides coverage for North and South America

Images available online as well.

WFABBA imagery is generated using a modified alpha-blending technique.

Data from GOES and a landcover map derived from 1-km resolution Advanced Very High Resolution Radiometer (AVHRR)



# Real Time AQ Forecast: Wild Fire location

**Run prep-chem-sources** to get wild fire locations onto model domain  
Combine files from past 1.5 days to remove cloudy sky issues

Files containing WF-ABBA data on /public/data/sat

f20082900000.namer.v61.g11.filt  
f20082900030.namer.v61.g11.filt  
f20082900100.namer.v61.g11.filt

Format (ASCII with header)\*

NOAA/NESDIS/ORA University of Wisconsin-Madison/CIMSS

GOES-11 WF\_ABBA (vs 6.1) Experimental Filtered Fire Product

Note: This product is preliminary and has not been quality controlled

Date: 2008290 Time: 0 UTC Filtered file: 12 hours 24 files

Longitude	Latitude	T4(K)	T11(K)	Size(km2)	Temp(K)	Ecosystem	Fire Flag
-124.74	55.21	299.9	273.2	-9.0000	-9.	21	3
-123.54	54.73	317.5	275.0	-9.0000	-9.	21	3
-123.56	54.65	307.1	275.0	-9.0000	-9.	21	5
-116.41	47.22	294.6	264.4	-9.0000	-9.	22	3
-116.74	46.81	290.8	260.4	-9.0000	-9.	22	3
-115.89	46.47	299.8	277.4	-9.0000	-9.	20	3
-119.67	37.56	304.0	291.0	-9.0000	-9.	22	2

\* Mainly use first two columns

# Real Time AQ Forecast: Fire emissions

## Including fire emissions in the model

Biomass burning and wildfires } Smoldering : mostly surface emission.  
 Flaming: mostly direct injection in the PBL, free troposphere or stratosphere.

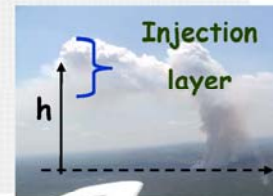


### Plume rise model

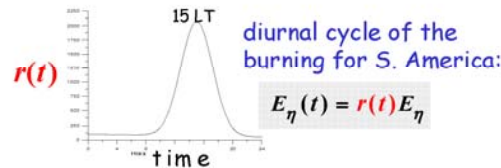
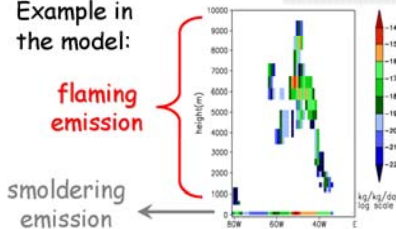
total emission flux:  $F_\eta$  being  $\lambda$  the smoldering fraction

$$\text{smoldering term: } E_\eta = \frac{\lambda F_\eta}{\rho_{air} \Delta z_{\text{first phys. model layer}}}$$

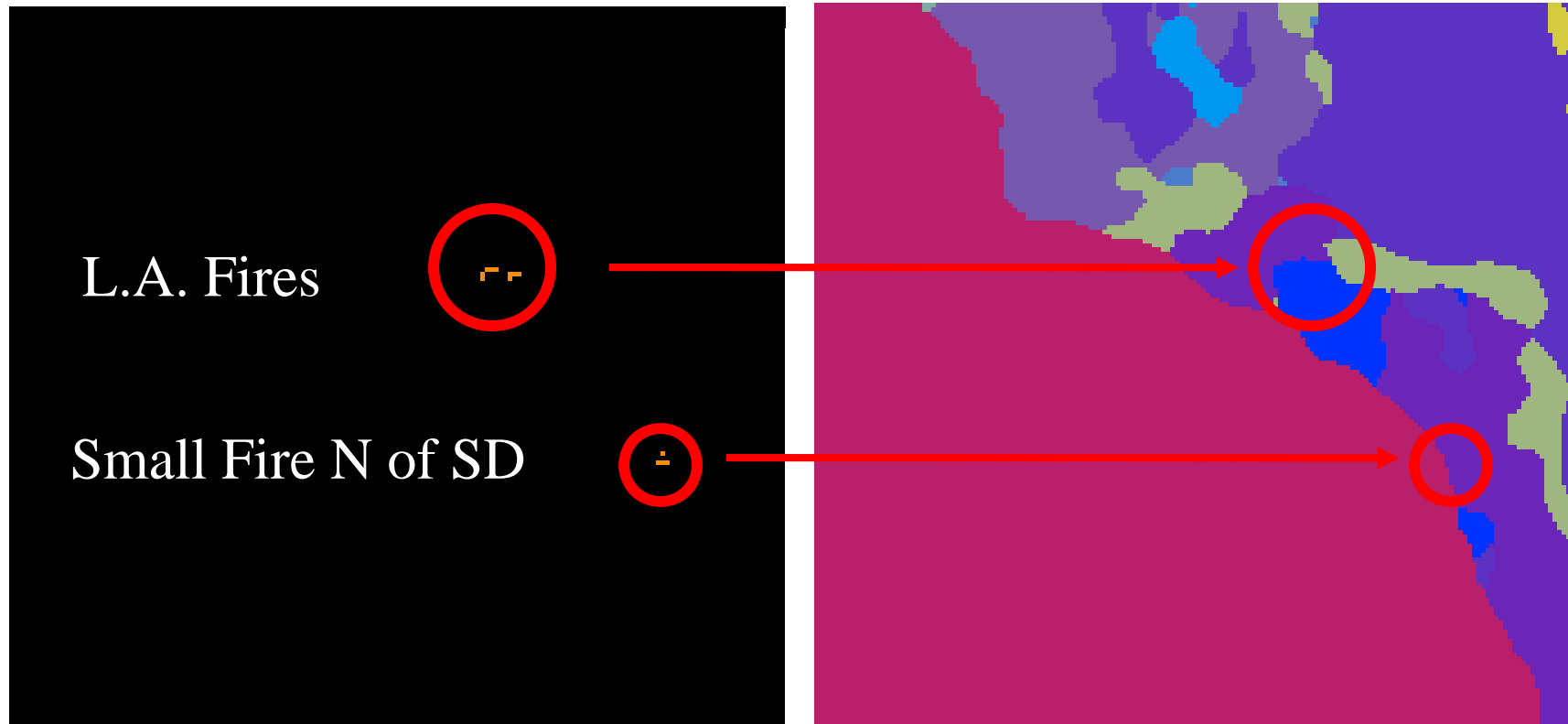
$$\text{flaming term: } E_\eta = \frac{(1 - \lambda) F_\eta}{\rho_{air} \Delta z_{\text{injection layer}}}$$



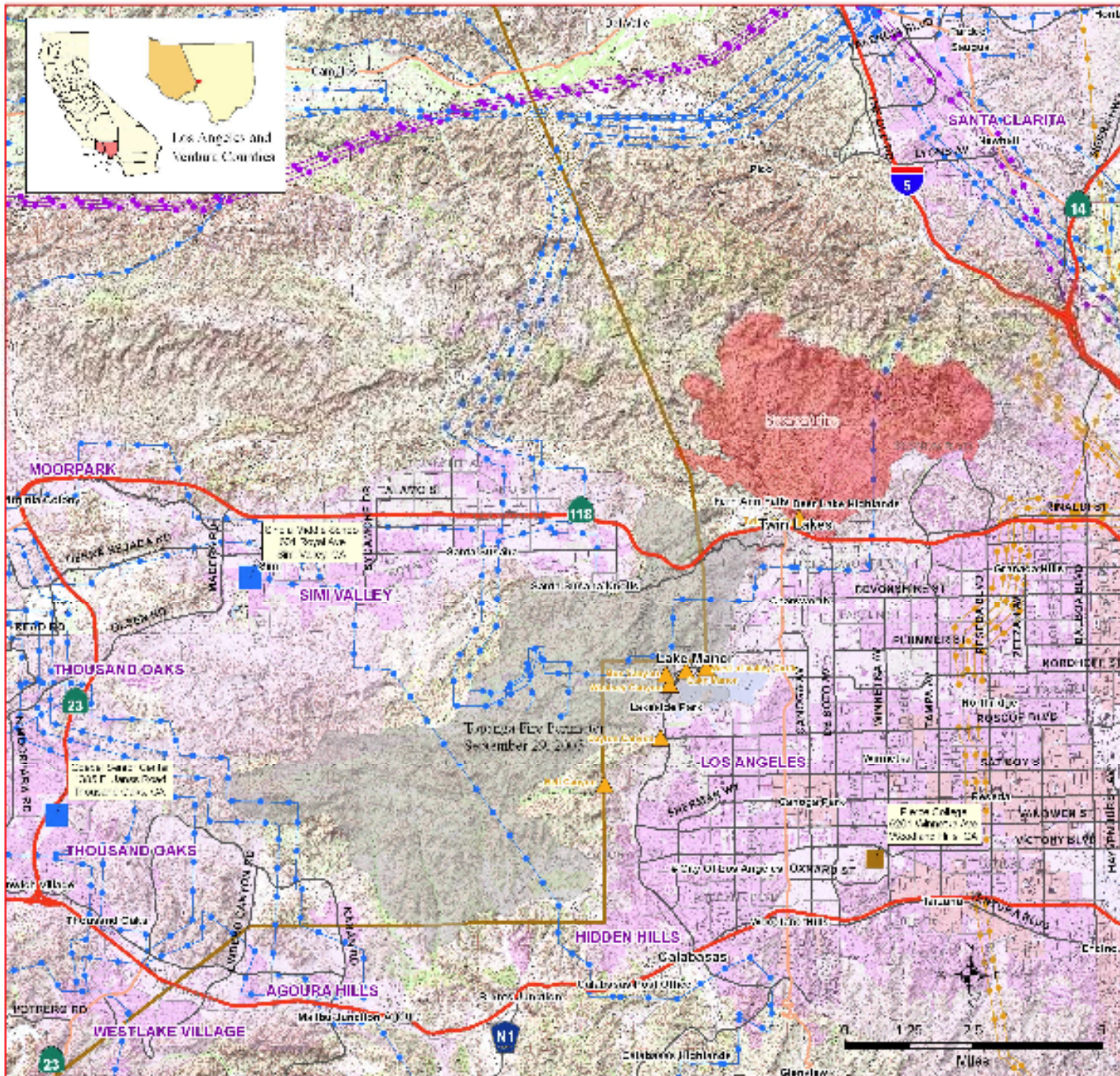
Example in the model:



# Real Time AQ Forecast: Wild Fire location







**SESNON FIRE**  
 CA-LAC-08216125  
 as of 10/14/08 - 0700 Hrs  
 9,873 Acres (54 Contained)  
 Started October 13, 2008 1058 Hrs  
 Los Angeles/Ventura Counties  
 PMAG Approved #2789

**Fire Threats and Damages:**  
 19 Residences Destroyed  
 3,500 Residences Threatened  
 100 Commercial Properties Threatened

10,000+ Acres of critical vegetation threatened  
 by smoke. Possible impact to California Condor  
 and other species. Potential impact to the  
 East Channel of the Santa Clara River and California  
 Light House. Some roads may be closed. The fire  
 perimeter will continue to be dynamically closed as  
 needed for firefighting operations to be conducted  
 safely. Evacuation will be initiated.

- Fire Perimeter as of 10/13/08 - 2100 Hrs
- Evacuation Zones 10/13/08
- Evacuation Center
- Domestic Animal Shelter
- ▲ Released Cattle
- Major Roads (TBM)**
- Freeway
- Highway
- Parkway
- Secondary
- Transmission Line**
- SCL 69KV
- SCL 220KV
- LADWP 230KV
- Incidence - Fire Perimeter as of 10/28/08
- Incorporated City Limits

Created: 08/05/08 09:00 AM  
 Printed: 10/14/08  
 Version: 10/14/08 09:00 AM  
 File Path: \\sdc\apps\GIS\GIS\08216125\08216125.mxd  
 Scale: 200,000:1



# HRRR-Chem products available online

<http://www-frd.fsl.noaa.gov/mab/hrrr3wchem/>

Comparison with HRRR forecast not using chemistry

## HRRR (With Chem) Model Fields 29-Oct-2008, 18 UTC run

Click on a check mark to see an image or animation (javascript) in a separate window.

<b>Model</b> <input checked="" type="radio"/> HRRR <input type="radio"/> HRRR_NOCHEM		<b>Run</b> 29 Oct 2008 - 18Z <span style="float: right;">Update products</span>													
<b>HRRR HRRR_NOCHEM Comparison</b> <input checked="" type="radio"/> NONE <input type="radio"/> SIDE-SIDE		You may need to click "Update" in order to update the table!													
	All times (loop)	Forecast valid times (UTC)													
		Anal- ysis Wed 18	Wed 19	Wed 20	Wed 21	Wed 22	Wed 23	Thu 00	Thu 01	Thu 02	Thu 03	Thu 04	Thu 05	Thu 06	
sfc temp	✓	✓			✓			✓			✓			✓	
sfc dew point	✓	✓			✓			✓			✓			✓	
sfc wind	✓	✓			✓			✓			✓			✓	
total acc precip	✓	✓			✓			✓			✓			✓	
convective precip	✓	✓			✓			✓			✓			✓	
snow water equiv	✓	✓			✓			✓			✓			✓	
precip type	✓	✓			✓			✓			✓			✓	
reflectivity	✓	✓			✓			✓			✓			✓	
CAPE	✓	✓			✓			✓			✓			✓	
CIN	✓	✓			✓			✓			✓			✓	
precipitable water	✓	✓			✓			✓			✓			✓	
850mb temp	✓	✓			✓			✓			✓			✓	
850mb wind	✓	✓			✓			✓			✓			✓	
850 rh	✓	✓			✓			✓			✓			✓	
850-500 mean rh	✓	✓			✓			✓			✓			✓	
700mb vvel	✓	✓			✓			✓			✓			✓	
500mb vort	✓	✓			✓			✓			✓			✓	
250mb wind	✓	✓			✓			✓			✓			✓	
visibility	✓	✓			✓			✓			✓			✓	
cloud top height	✓	✓			✓			✓			✓			✓	
ceiling	✓	✓			✓			✓			✓			✓	
sfc ozone concentration	✓	✓			✓			✓			✓			✓	
sfc pm10 aerosol dry mass	✓	✓			✓			✓			✓			✓	
sfc pm2.5 aerosol dry mass	✓	✓			✓			✓			✓			✓	
downward long-wave radiation	✓	✓			✓			✓			✓			✓	
downward short-wave radiation	✓	✓			✓			✓			✓			✓	
ground heat flux	✓	✓			✓			✓			✓			✓	



# Summary

- WRF-Chem can be used for real-time forecasts
  - The model is not too complex
  - Shows improvement over time (typical for any model)
- Graphical products can be made available in real-time through a variety of methods
  - Use of web is an idea pathway to end user
  - Need to know your customer and provide products designed to their need
    - Do not need to provide every data array

# Summary

- Making the forecast is not the end of the process as evaluation needs to take place
  - Need to examine model data and compare with available observations
    - Ideally evaluations conducted by others
    - Meteorology
    - Chemistry
  - Need to demonstrate “three-dimensional thinking” whenever possible
    - Surface data provides only part of the answer
    - Different model parameter choices can produce very different results
      - User should carefully examine the choices and be aware of the impact of their selections
    - There is no single perfect numerical model
      - Ensemble techniques show great promise

# Summary

Chemistry evaluation - look at the whole picture (surface and upper air)  
- evaluate model and current scientific understanding

- WRF/Chem O<sub>3</sub> photochemistry conforms to available observations
- WRF/Chem (and other models) PM<sub>2.5</sub> less reliable sensitive to several processes with large uncertainties
- Simple GOcart Aerosol Option shows marked improvement in simulating aqueous-phase SO<sub>2</sub> conversion
- Chemistry biases very sensitive to PBL scheme
- Emissions (both from inventories and satellite data) are changing rapidly
- 2005 NEI NO<sub>y</sub> emissions consistent with 2006 observations (+/- 25%)
- Developed a technique to relate raw model output to emission ratios:
  - High CO/NO<sub>y</sub> ratios for all models (but little effect on O<sub>3</sub>)
  - Ethylene/NO<sub>y</sub> consistent for Dallas, too low for Houston
- Satellite comparisons useful in emissions verification and satellite retrieval validation