

# Evaluate and Enhance Suomi NPP Products for Air Quality and Public Health Applications



**PI:**

**Jun Wang**



**Co-Is:**

**Yang Liu**

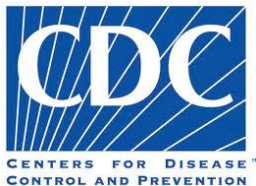


**Robert Levy**



**James J. Szykman**

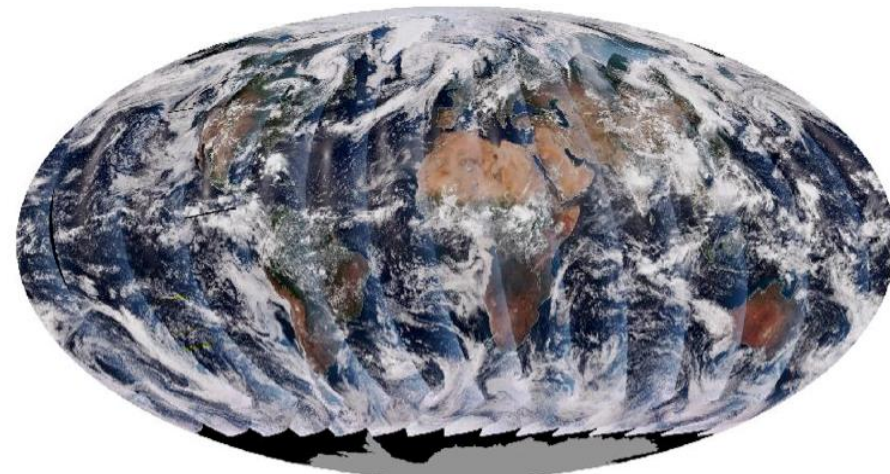
*In collaboration with*



**Ying Zhou**

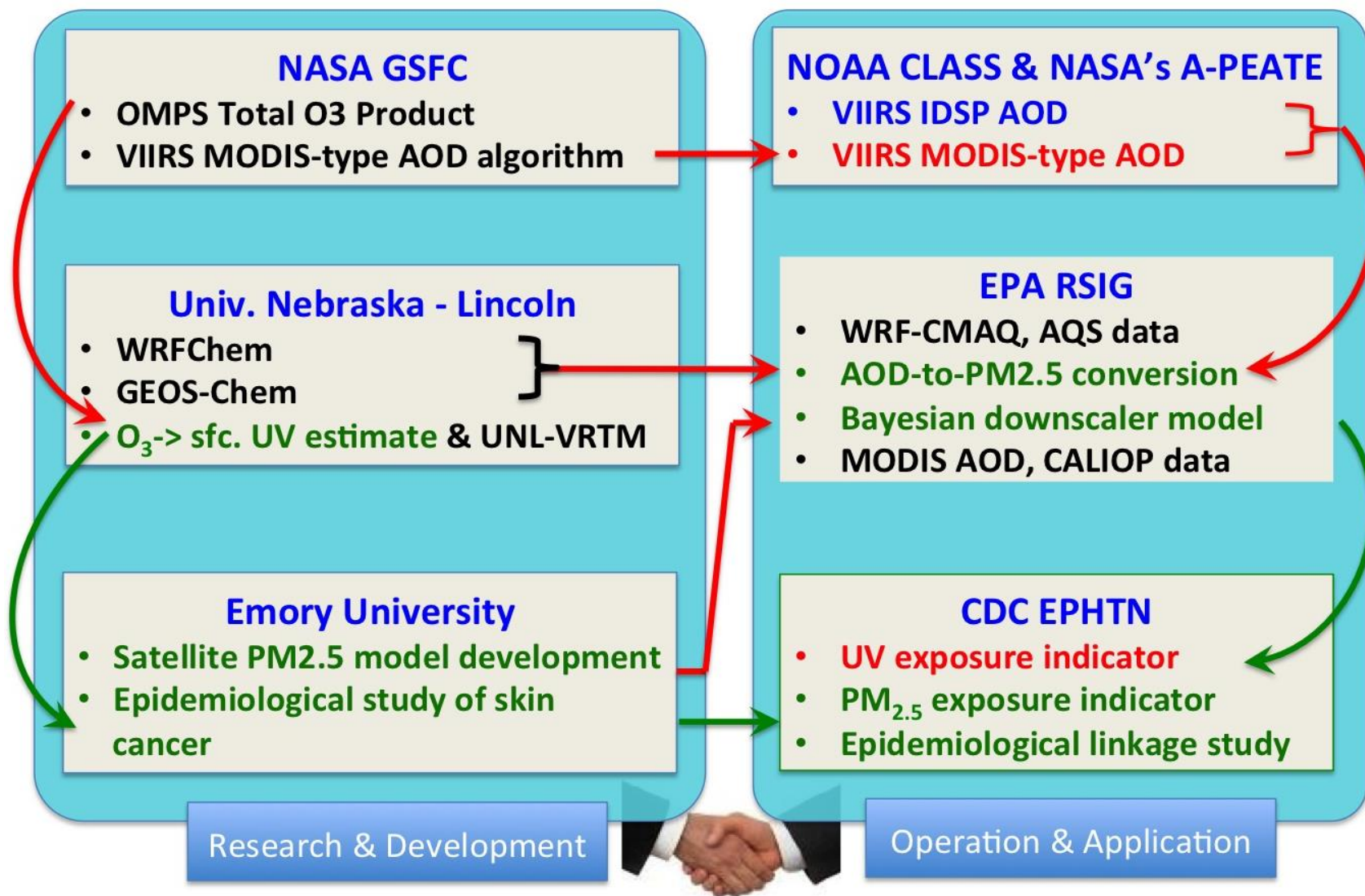


**Robert Holz**



**VIIRS, 13:30 Local Time  
14.1 revs/day**

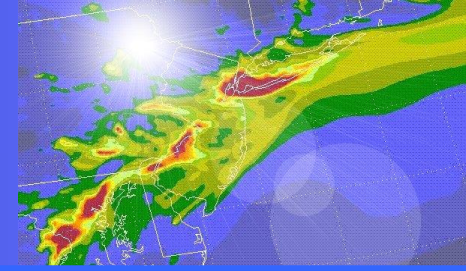
# Work/Data Flow & Approaches



Black: datasets & model already in place; green: existing model capability and data flow that will be *improved*; red: the data and data flow will be created



# Key Features Designed into RSIG



- Accessible from computers outside the EPA network: (<http://badger.epa.gov/rsig>).
- Subsets files at the source, allowing users to access most current data version.
- Aggregates data files in time and space within visualization and save functions.
- Allows for on-the-fly re-gridding of satellite data onto standard CMAQ model grid or user specified grid parameters.
- Provides many useful "Save As" formats for the data and images, such as XDR binary, ASCII, HDF, MPEG, NetCDF, and KMZ.
- Interoperable with other OGC-compliant systems.



Aux Vars Scenario Options Prefs

Data Sources:

CALIPSO

- Satellite--
- MODIS
- VIIRS
- CALIPSO
- GASP
- Model--
- CMAQ-CDC East
- CMAQ-CDC-CONUS
- Air Quality Stations--
- AQS
- AIRNow
- AIRNow2
- Meteorology Stations--
- Surfmet
- Other--
- NEUBrew
- GOES-BB
- UVnet
- FAQSD
- Functions--
- Diff
- Abs\_diff
- Percent\_diff
- Ratio
- Intersect

CMAQ-CDC-CONUS

AQS

GASP

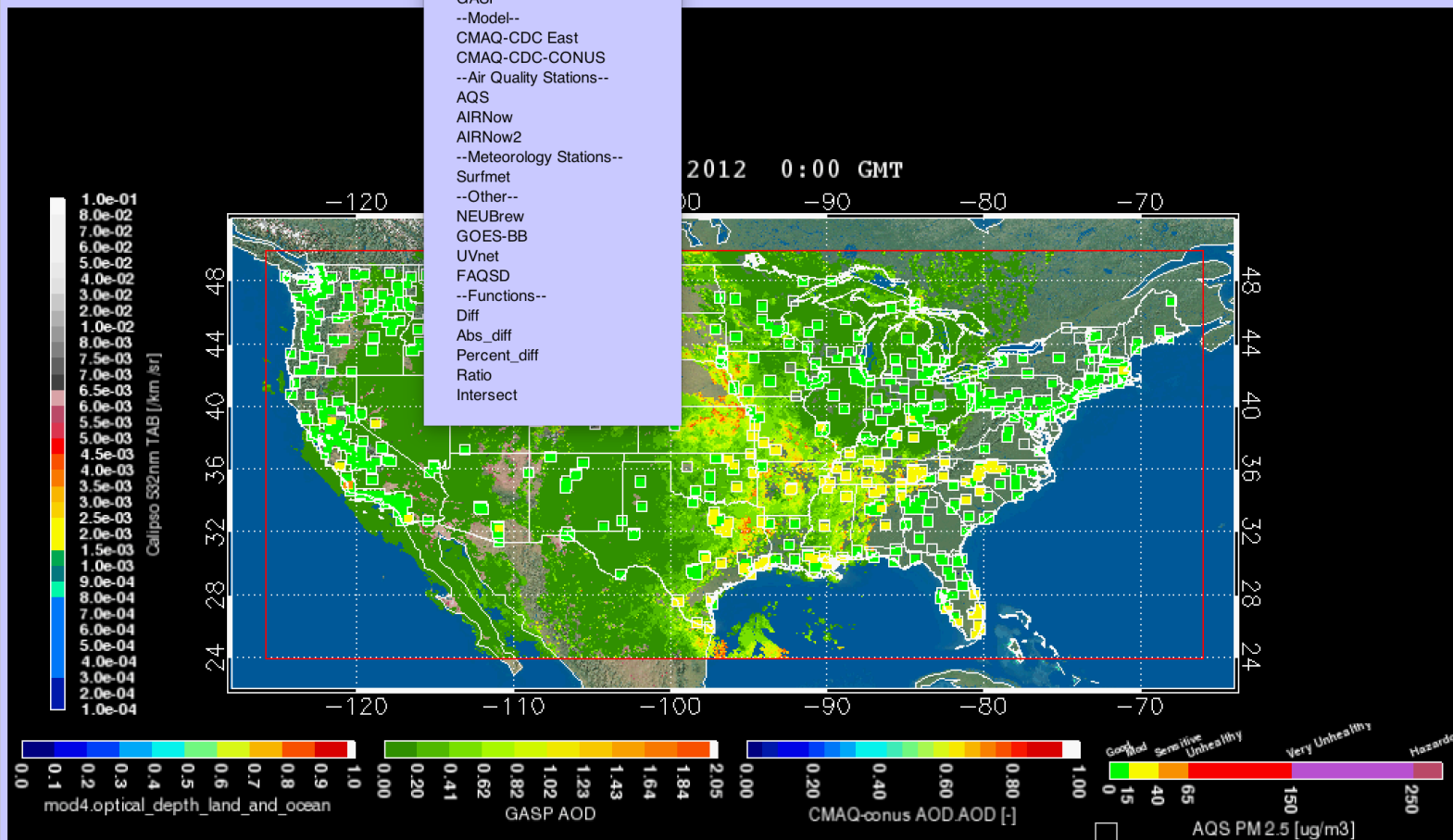
Variables:

16 I1.total\_attenuated\_...

AOD

PM 2.5

AOD



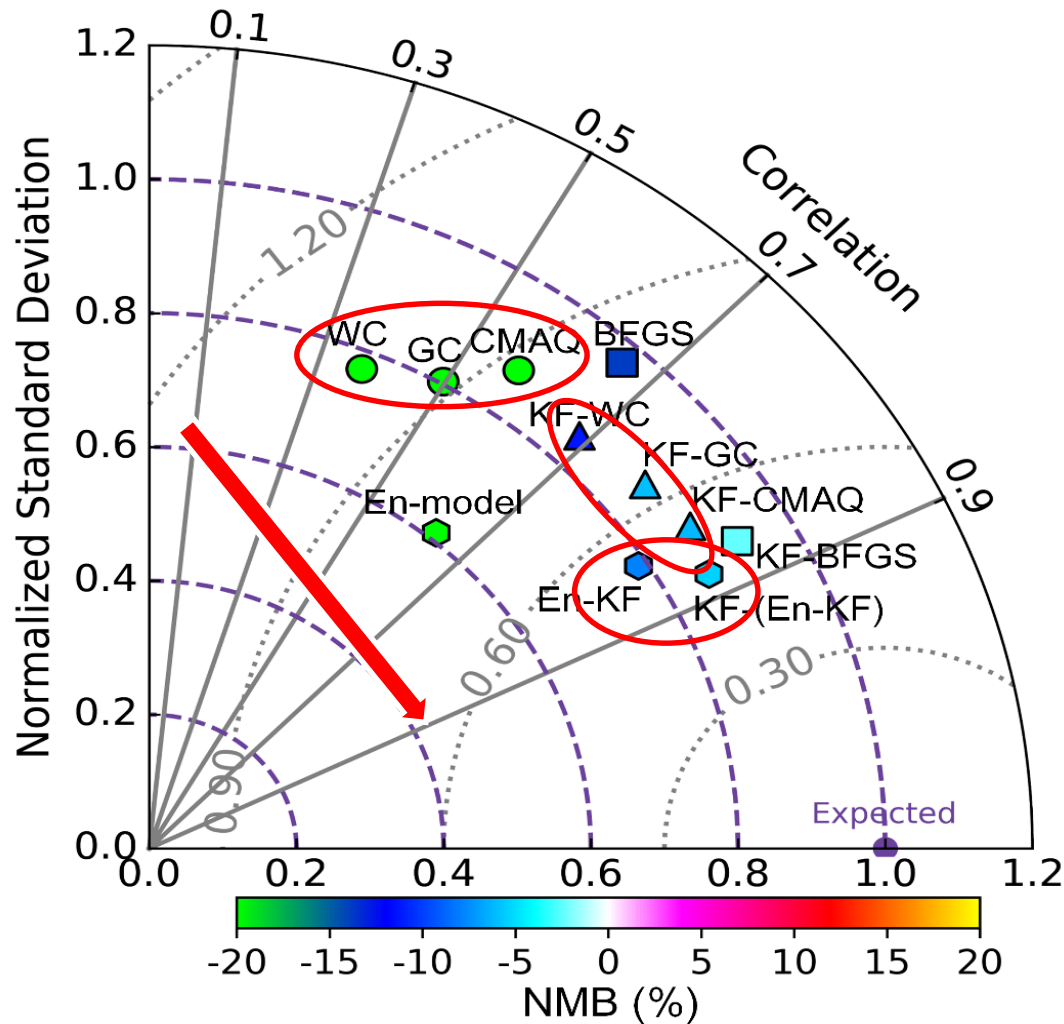
20120620: FINISHED RENDERING animation.

Use the Playback Controls to view the animation.

When finished, press 'Clear Image Cache' to process another scenario.

<input checked="" type="checkbox"/> Show <input type="checkbox"/> Save <input type="checkbox"/> Help <input type="checkbox"/> Cancel	<b>Date Controls</b> Date: 2012 Jun 26 Number of days to process: 1	<b>Bounding Box</b> N 50 W -126 -66 E S 24	<b>Map Controls</b> County State Nation Globe	<b>Playback Controls</b> Play Rate: 5 Clear Image Cache	For RSIG support: rsig@epa.gov (919) 541-4293 (919) 541-5500 ver: 2016102421
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# An Kalman filter ensemble approach to use multiple AOD products & multiple model output to QUICKLY IMPROVE PM2.5 PREDICTION



Two manuscripts to be submitted soon.

Summarized in last year's annual meeting.



EMORY  
UNIVERSITY



THE UNIVERSITY  
OF IOWA



# Surface erythemal UV irradiance in the continental United States derived from ground-based and OMI observations: quality assessment, trend analysis and sampling issues

Huanxin Zhang<sup>1,2</sup>, Jun Wang<sup>1,2</sup>, Lorena Castro García<sup>1,2</sup>, Jing Zeng<sup>1,2</sup>, Connor Dennhardt<sup>3</sup>, Yang Liu<sup>4</sup>, and Nickolay A. Krotkov<sup>5</sup>

ACP, 19, 2165-2181, 2019

Compilation and spatio-temporal analysis of publicly available total solar and UV irradiance data in the contiguous United States<sup>☆</sup>

Ying Zhou<sup>a,1</sup>, Xia Meng<sup>b,1</sup>, Jessica Hartmann Belle<sup>b</sup>, Huanxin Zhang<sup>c</sup>, Caitlin Kennedy<sup>a</sup>, Mohammad Z. Al-Hamdan<sup>d</sup>, Jun Wang<sup>c</sup>, Yang Liu<sup>b,\*</sup>

*Environmental Pollution*, 253, 130-140, 2019.

**Acknowledgements:** NASA Aura and Applied Science Programs, TEMPO mission

## In the U.S.

- **More people** are diagnosed with skin cancer each year in the U.S. than all other cancers combined.
- **One in five Americans** will develop skin cancer by the age of 70
- **More than 2 people** die of skin cancer every hour
- In 1994 - 2014, the diagnosis and treatment of **nonmelanoma skin cancers increased by 77%**. ~ 90 percent of nonmelanoma skin cancers are associated with exposure to ultraviolet (UV) radiation from the sun
- In 2009 – 2019, the number of new invasive **melanoma cases** diagnosed annually **increased by 54%**. Having **5 or more sunburns** doubles the risk for melanoma.

sunburns



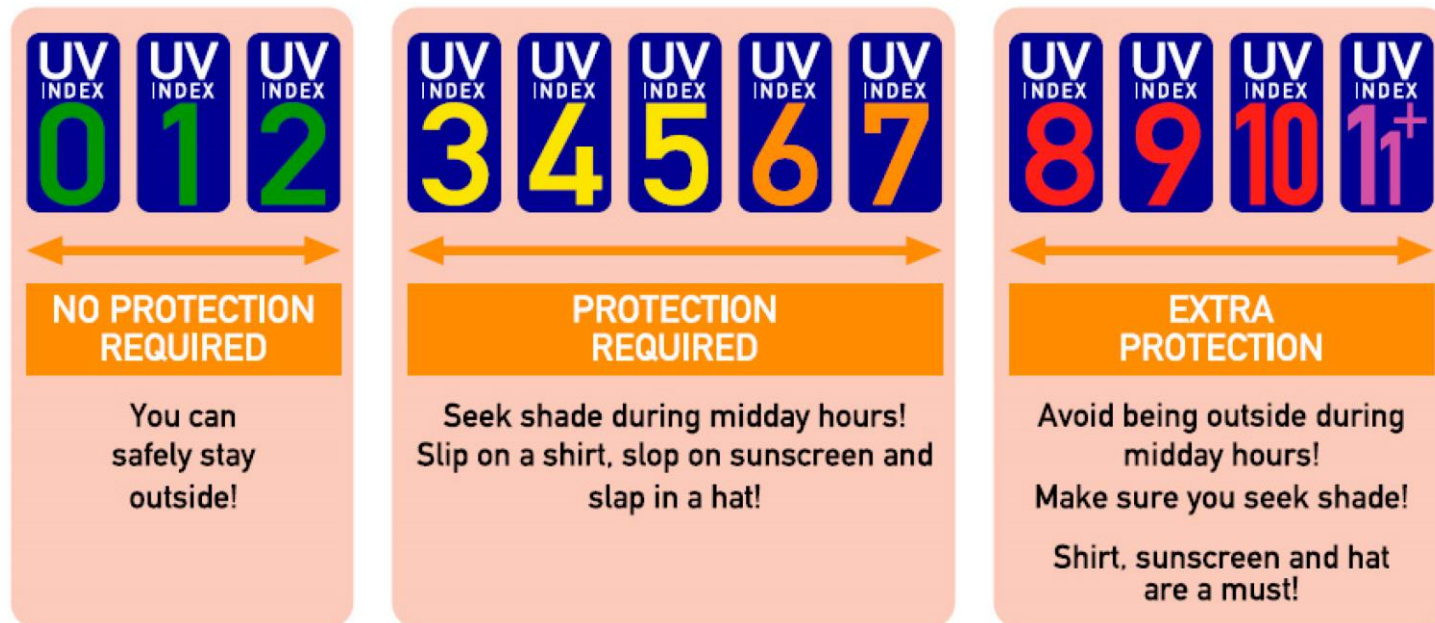
Nonmelanoma skin cancer



melanoma

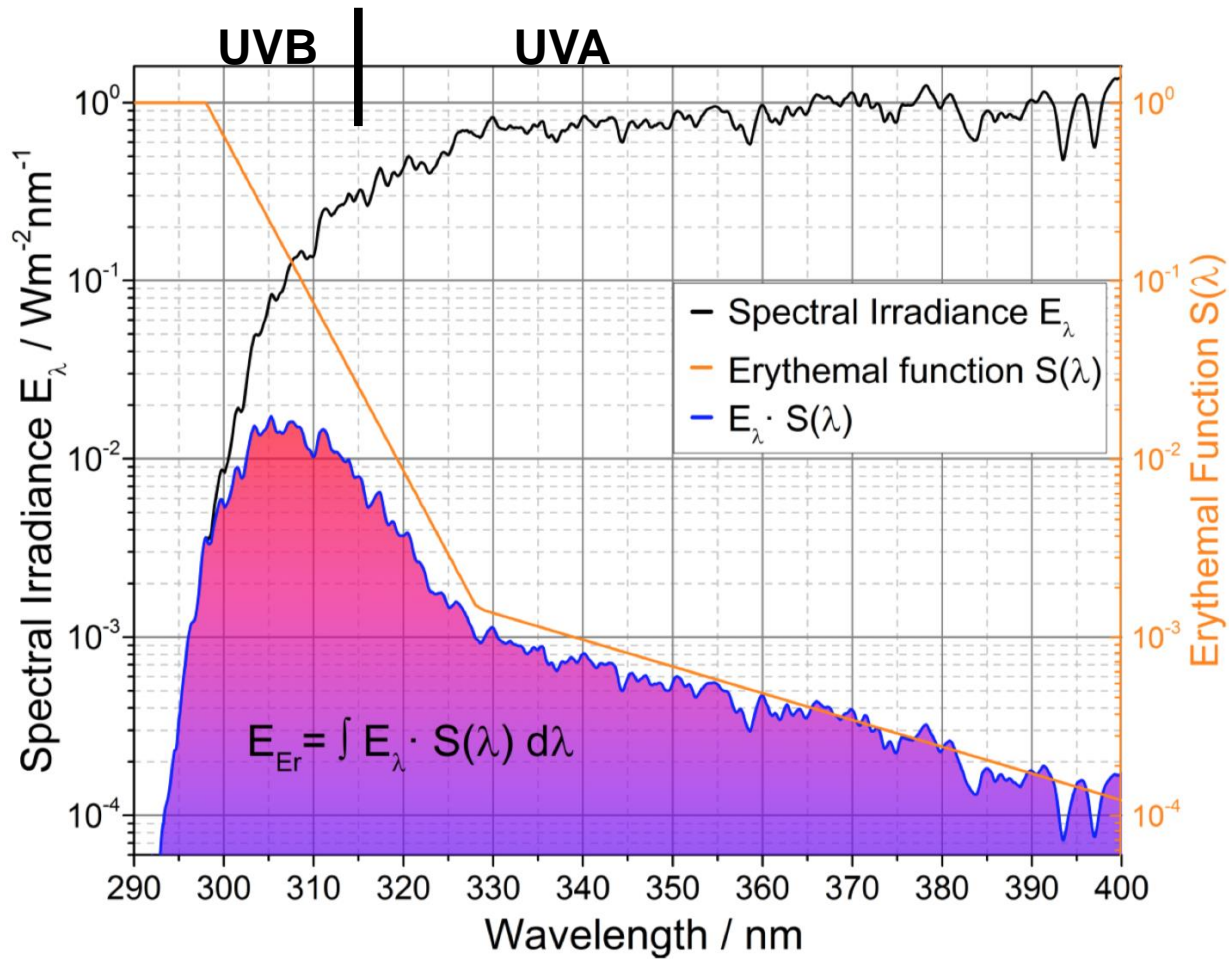


# WHO guidance, also recommended by EPA



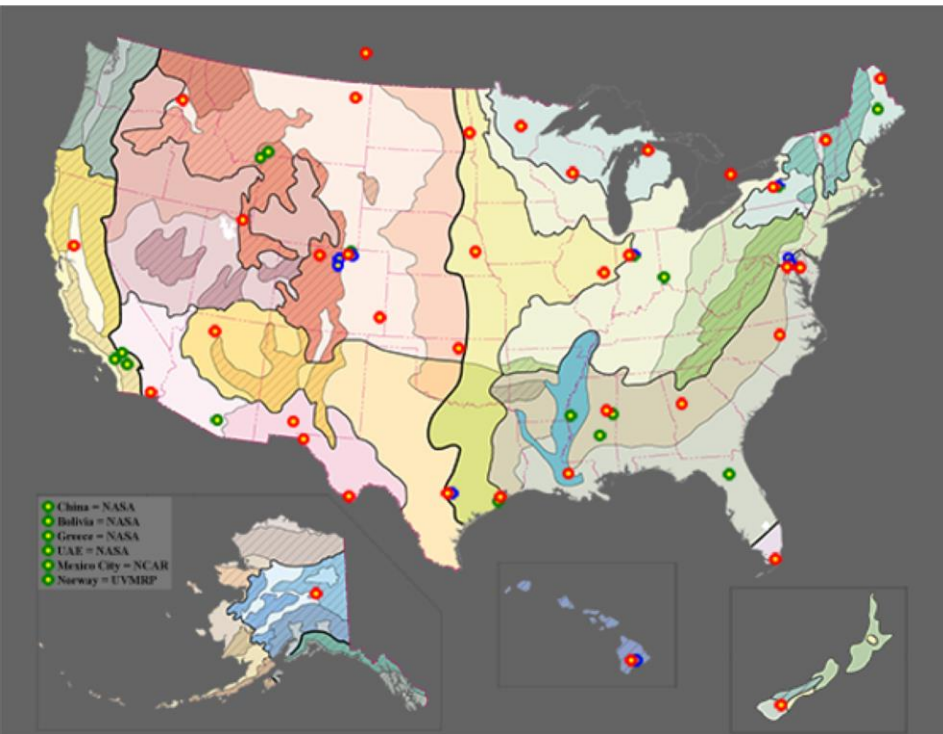


**UV Index = Erythemal Weighted Irradiance / 25 mWm<sup>-2</sup>**



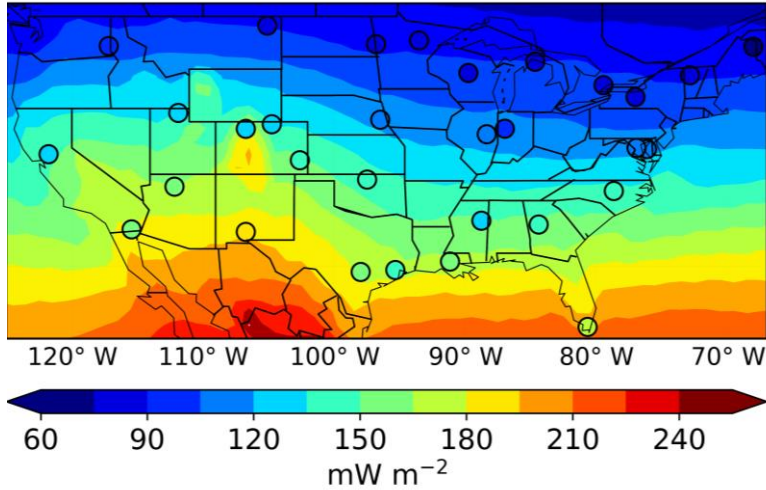
# USDA UV Monitoring & Research Program UVMRP network

3-minute averaged data from 31 stations in 2005 – 2017 are used for this study



(<http://uvb.nrel.colostate.edu/UVB/index.jsf>)

Jan. 2005 – Dec. 2017

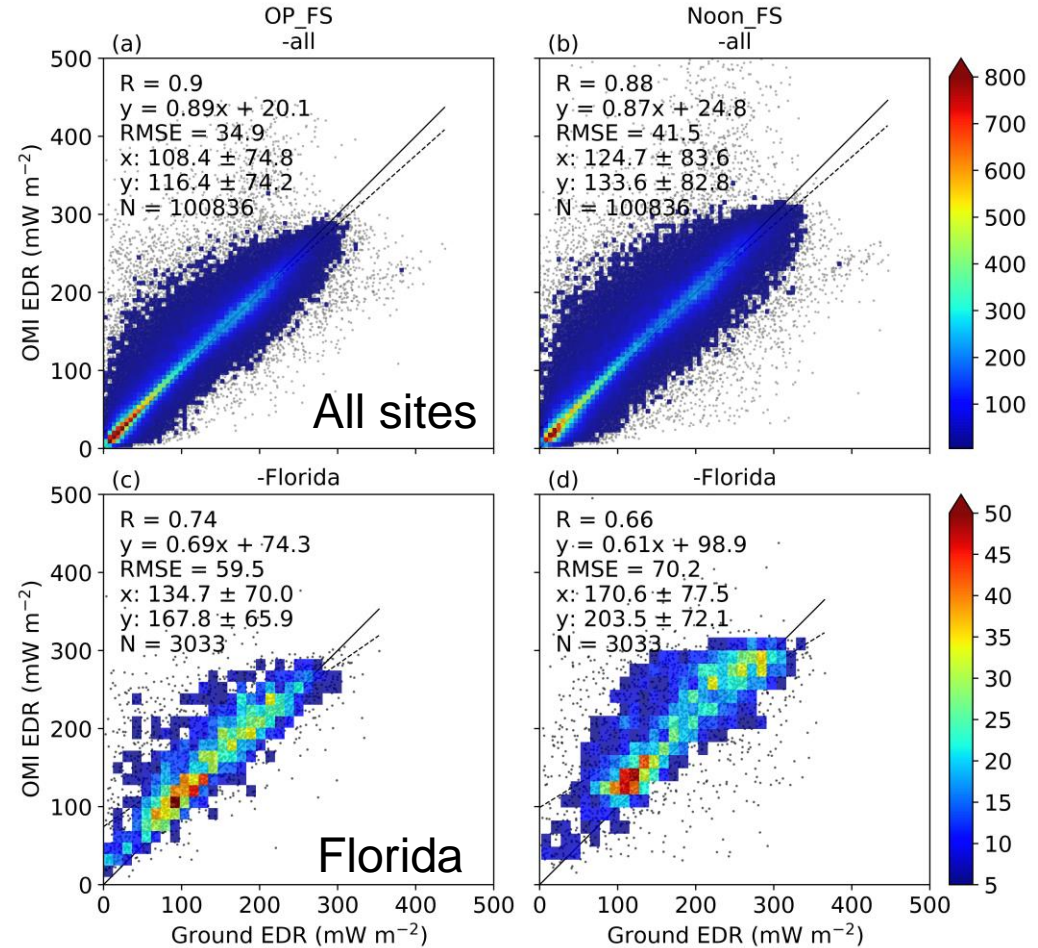


Overall,  $R \sim 0.9$  and bias by +7%.

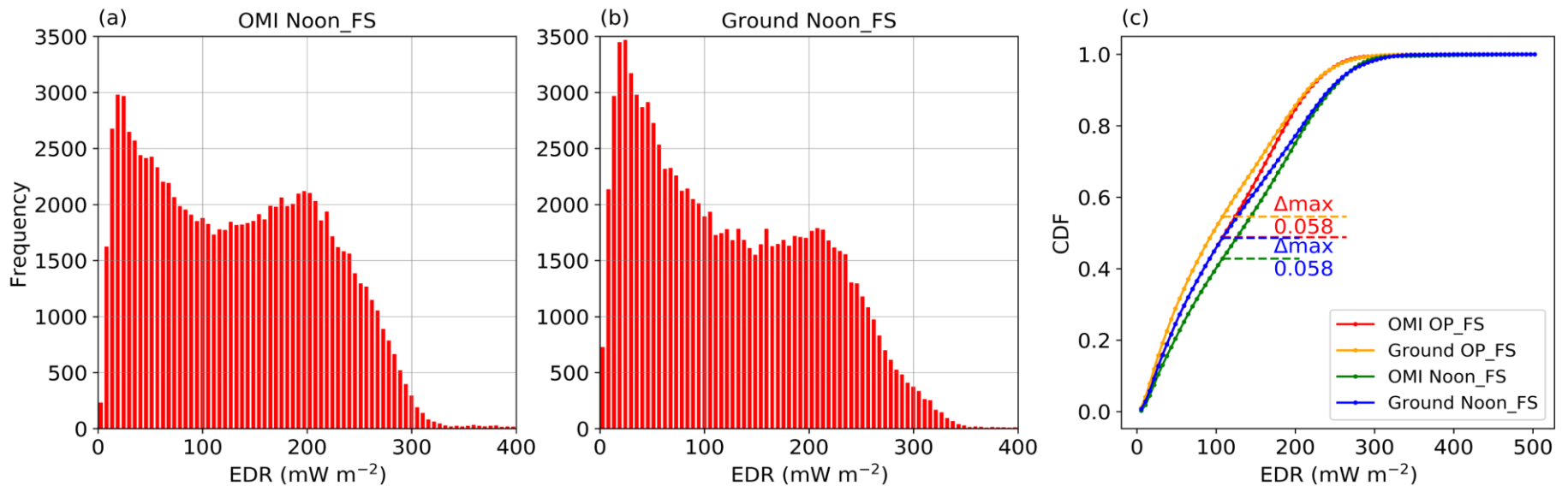
Vary by station. Worst in Florida ( $R \sim 0.7$ ; bias: +20%).

OMI overpass time

Noontime



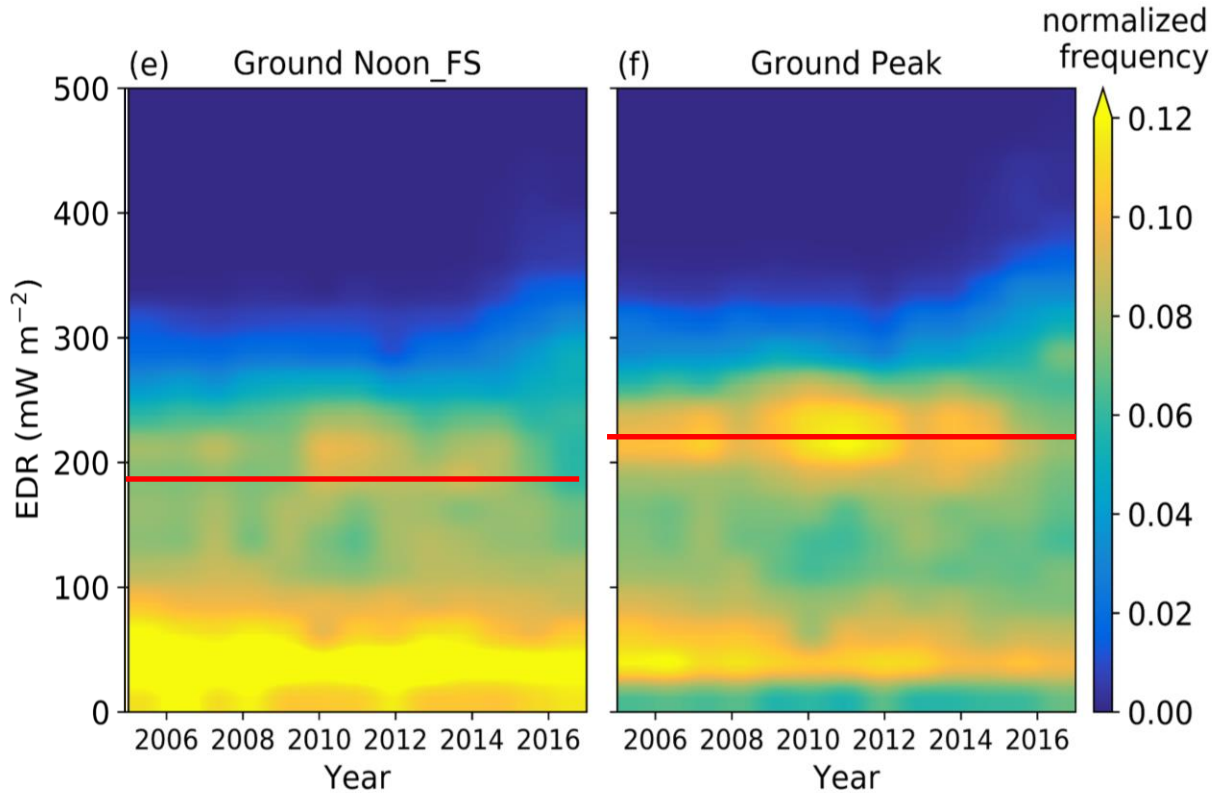
# Statistically significant agreement in climatology (in terms of PDFs between OMI and surface obs.)



**Kolmogorov-Smirnov (K-S) test**

# Climatological difference

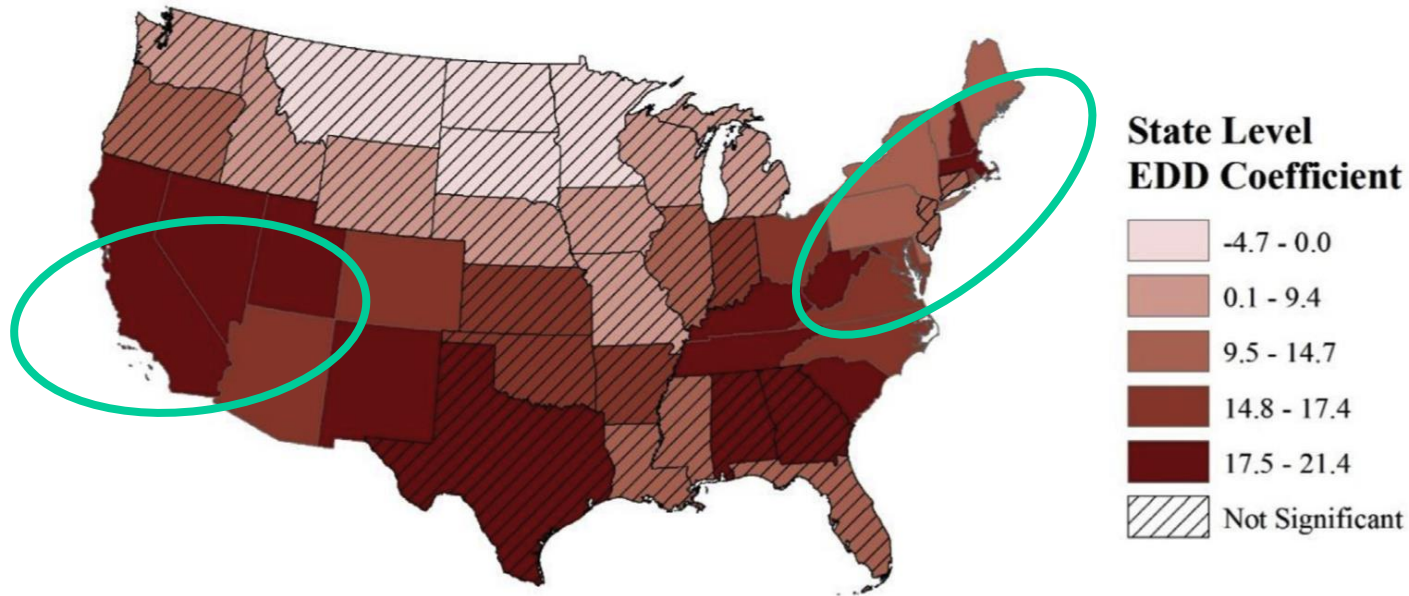
Due to once-per-day vs. every 3-hour sampling



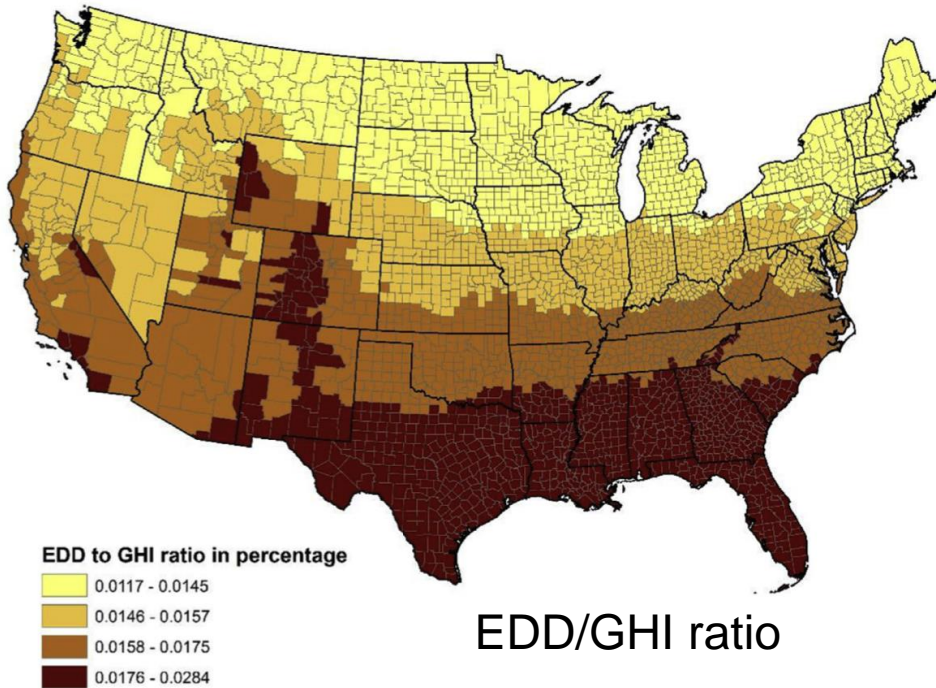
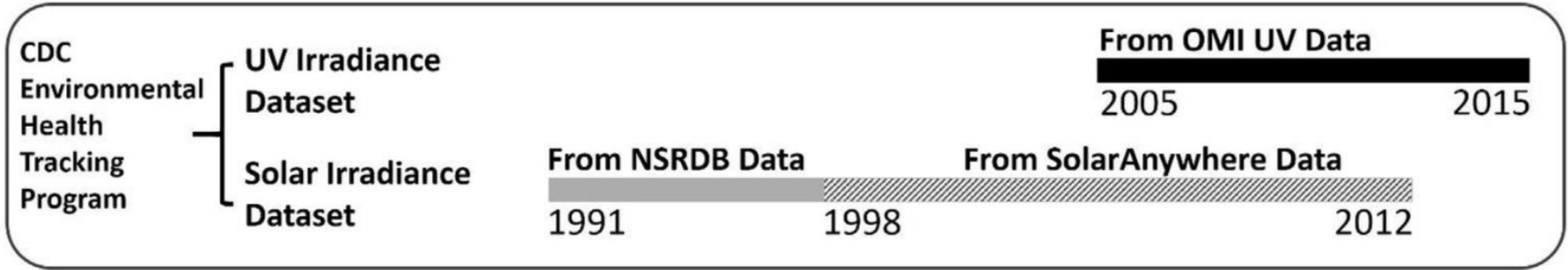
Climatology of EDR at  
noon time at each site

Climatology of daily peak  
EDR at each site

# Trends of population-weighted annual UV exposure in 2005-2017 for each state



- Overall, an increase in most states. Statistically significant trend can be found in southwest states (California, Arizona, Mexico, Nevada, Utah and Colorado) and east coast states (0.3-0.7% per year).
- Appears to support that “In 1994 - 2014, the diagnosis and treatment of nonmelanoma skin cancers increased by 77%”. <https://www.skincancer.org/>



In the past, solar irradiance data is used to estimate surface UV irradiance by using a constant conversion ratio. But, this ratio changes with location and time.

**OMI surface erythemal data is now used in CDC health track data portal.**

# Summary

- **Milestones**
  - Data flow from UW-SIPS (Science Investigator Processing System) to EPA's RSIG is implemented, tested, and successful. **ARL4->ARL-8**
  - Evaluation of ensemble approach for surface PM<sub>2.5</sub> estimates from VIIRS and other satellite projects is conducted for June 2012. This would provide insight on the selection and improvement of operation approach for remote sensing of surface PM<sub>2.5</sub>. **ARL4->ARL7; Two manuscripts in prep.**
  - Satellite-based eurythermal UV data is validated and used for public health studies. **ARL8.**
- **Publications: ~10.**
- **Risk and challenges**
  - **No risk. Things are as planned.**
  - **Challenges. No.**



IEEE  
**GEOSCIENCE AND REMOTE SENSING LETTERS**

A PUBLICATION OF THE IEEE GEOSCIENCE AND REMOTE SENSING SOCIETY



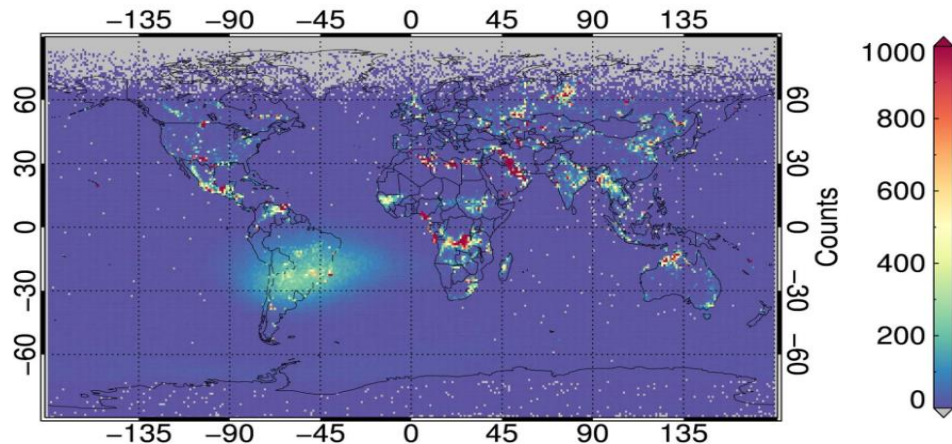
JUNE 2015

VOLUME 12

NUMBER 6

IGRSBY

(ISSN 1545-598X)



Regions of frequent biomass burning and gas flaring highlighted by NOAA's Nightfire product during 18 March–14 July 2013. Interference from the South Atlantic Anomaly (SAA) is visible over a large portion of South America.

**Thank you !**

**Journal-cover article:**

Polivka, T., E. Hyer, J. Wang, and D. Peterson, First global analysis of saturation artifacts in the VIIRS infrared channels and the effects of sample aggregation, *IEEE Geoscience and Remote Sensing Letters*, 1262-1266, 2015.

Lincoln. The work of J. Wang was supported by the National Aeronautics and Space Administration (NASA) S-NPP Program and Applied Science Program under Grant NNX11AJ03G managed by John A. Haynes and Lawrence A. Friedl. T. Polivka also acknowledges the support from the NASA Nebraska Space Grant.

# IEEE TRANSACTIONS ON GEOSCIENCE AND REMOTE SENSING

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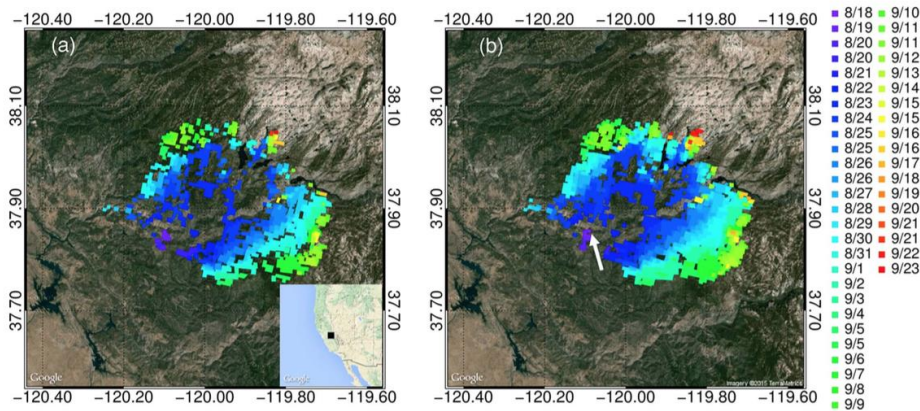
SEPTEMBER 2016

VOLUME 54

NUMBER 9

IGRSD2

(ISSN 0196-2892)



Progression of the 2013 Rim Fire from ignition to extinction, as revealed by the operational Active Fire Application Related Product (left) and the Firelight Detection Algorithm (right), both using the same input data from the VIIRS aboard the Suomi-NPP satellite.

# Thank you !

Journal-cover article:

Polivka, T., **J. Wang**, L. Ellison, E. Hyer, and C. Ichoku, Improving Nocturnal Fire Detection with the VIIRS Day-Night Band, *IEEE Transactions on Geoscience & Remote Sensing*, 9, 5503-5519, 2016.



date of current version August 2, 2016. This work was supported in part by the NASA Suomi NPP Program and Applied Science Program managed by John A. Haynes and Lawrence A. Friedl and in part by the Interdisciplinary Studies (IDS) Program directed by J. Kaye and administered through the Radiation Sciences Program managed by Hal B. Maring. The work of T. Polivka was also supported by the NASA Nebraska Space Grant.



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Atmospheric Environment

journal homepage: [www.elsevier.com/locate/atmosenv](http://www.elsevier.com/locate/atmosenv)

# Thank you !



Potential application of VIIRS Day/Night Band for monitoring nighttime surface PM<sub>2.5</sub> air quality from space



Jun Wang<sup>a,\*</sup>, Clint Aegerter<sup>a</sup>, Xiaoguang Xu<sup>a</sup>, James J. Szykman<sup>b</sup>

<sup>a</sup> Department of Earth and Atmospheric Sciences, University of Nebraska, Lincoln, NE, USA

<sup>b</sup> National Exposure Research Laboratory, U.S. Environmental Protection Agency, RTP, NC, USA

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### Keywords:

Nighttime  
PM<sub>2.5</sub>  
VIIRS  
Day/Night Band

night bands at the surface. The results show both qualitatively that the contrast of DNB images can indicate the change of air quality at the urban scale, and quantitatively that change of light intensity during the night (as characterized by VIIRS DNB) reflects the change of surface PM<sub>2.5</sub>. Compared to four meteorological variables (*u* and *v* components of surface wind speed, surface pressure, and columnar water vapor amount) that can be obtained from surface measurements, the DNB light intensity is the only variable that shows either the largest or second largest correlation with surface PM<sub>2.5</sub> measured at 5 different sites. A simple multivariate regression model with consideration of the change of DNB light intensity can yield improved estimate of surface PM<sub>2.5</sub> as compared to the model with consideration of meteorological variables only. Cross validation of this DNB-based regression model shows that the estimated surface PM<sub>2.5</sub> concentration has nearly no bias and a linear correlation coefficient (*R*) of 0.67 with respect to the corresponding hourly observed surface PM<sub>2.5</sub> concentration. Furthermore, ground-based observations support that surface PM<sub>2.5</sub> concentration at the VIIRS night overpass (~1:00 am local) time is representative of daily-mean PM<sub>2.5</sub> air quality (*R* = 0.82 and mean bias of  $-0.1 \mu\text{g m}^{-3}$ ). While the potential appears promising, mapping surface PM<sub>2.5</sub> from space with visible light at night still face various challenges and the strategies to address some of these challenges are elaborated for future studies.

## Geophysical Research Letters

### RESEARCH LETTER

10.1002/2016GL070204

#### Key Points:

- OMI and adjoint modeling can constrain monthly anthropogenic SO<sub>2</sub> emissions
- Twenty percent emission reduction during the Beijing Olympic Games are made evident
- Posterior emissions improve monthly forecasts of surface and column SO<sub>2</sub>

## A new approach for monthly updates of anthropogenic sulfur dioxide emissions from space: Application to China and implications for air quality forecasts

Yi Wang<sup>1,2</sup>, Jun Wang<sup>1,2</sup>, Xiaoguang Xu<sup>1,2</sup>, Daven K. Henze<sup>3</sup>, Yuxuan Wang<sup>4,5</sup>, and Zhen Qu<sup>3</sup>

### Acknowledgments

This work is supported by NASA Atmospheric Chemistry Modeling and Analysis Program (NNX13AK86G) managed by Richard S. Eckman, NASA Radiation Sciences Program managed by Hal B. Maring, NASA Aura Science managed by Kenneth Jucks, and NASA Applied Science program managed by John Haynes. Data shown in the paper can be obtained from the corresponding author through e-mail (jwangjun@gmail.com).

aska–Lincoln, Lincoln, Nebraska, USA, <sup>2</sup>Now at Center of  
nical and Biochemical Engineering, University of Iowa,  
iversity of Colorado Boulder, Boulder, Colorado, USA,  
Houston, Houston, Texas, USA, <sup>5</sup>Ministry of Education  
Science, Institute for Global Change Studies, Tsinghua





*remote sensing*

**Thank you!**  
MDPI

*Article*

# MODIS Retrieval of Aerosol Optical Depth over Turbid Coastal Water

Yi Wang <sup>1,2,3</sup>, Jun Wang <sup>1,2,3,\*</sup>, Robert C. Levy <sup>4</sup>, Xiaoguang Xu <sup>1,2</sup> and Jeffrey S. Reid <sup>5</sup>

<sup>1</sup> Department of Chemical and Biochemical Engineering, The University of Iowa, Iowa City, IA 52242, USA; yi-wang-4@uiowa.edu (Y.W.); xiaoguang-xu@uiowa.edu (X.X.)

<sup>2</sup> Center of Global and Regional Environmental Research, The University of Iowa, Iowa City, IA 52242, USA

<sup>3</sup> Interdisciplinary Graduate Program in Informatics, The University of Iowa, Iowa City, IA 52242, USA

<sup>4</sup> NASA Goddard Space Flight Center, Greenbelt, MD 20771, USA; robert.c.levy@nasa.gov

<sup>5</sup> Marine Meteorology Division, Naval Research Laboratory, Monterey, CA 93943, USA; jeffrey.reid@nrlmry.navy.mil

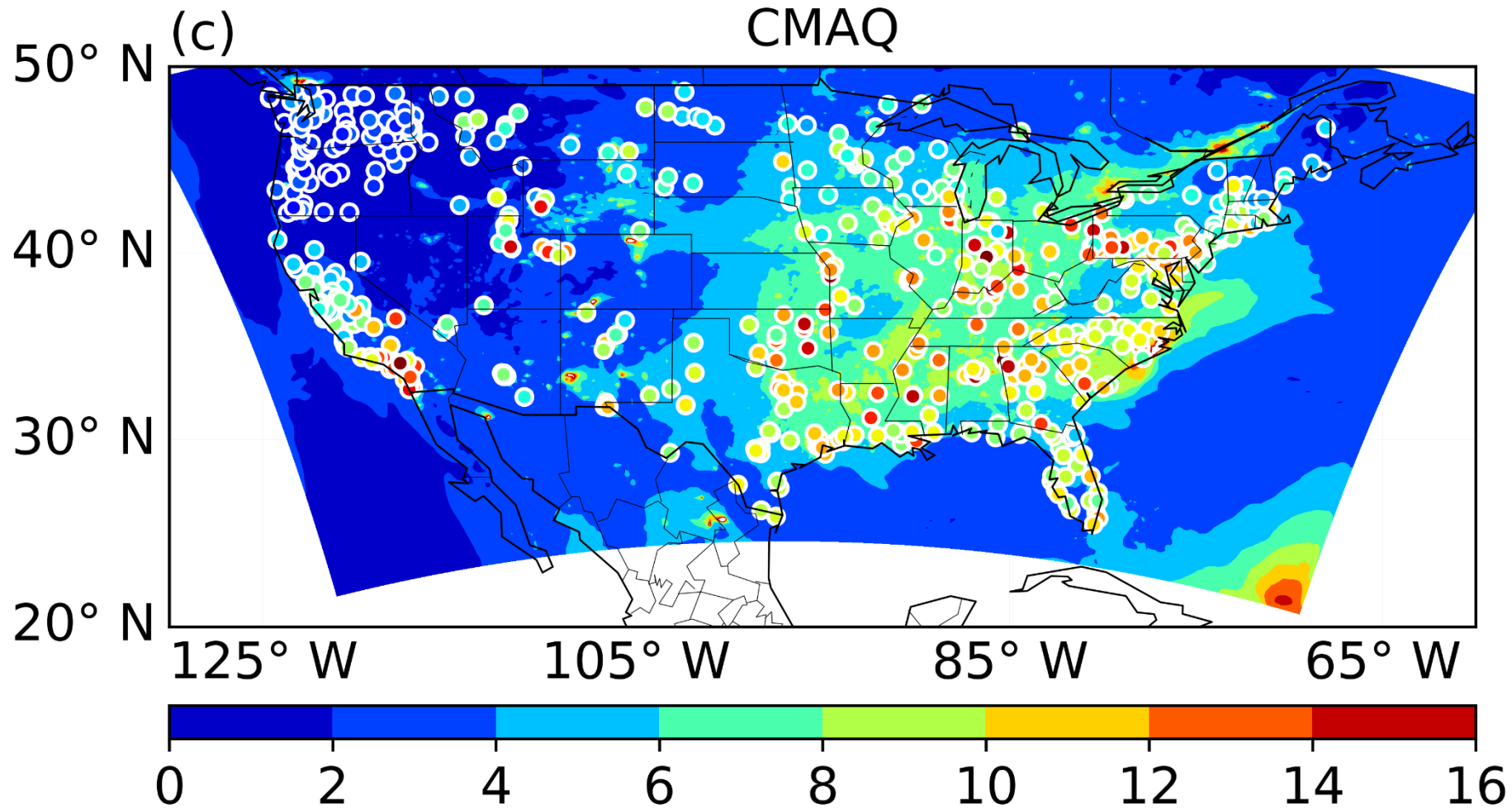
\* Correspondence: jun-wang-1@uiowa.edu; Tel.: +1-319-353-4483

*Remote Sens.* **2017**, *9*, 595;

doi:10.3390/rs9060595



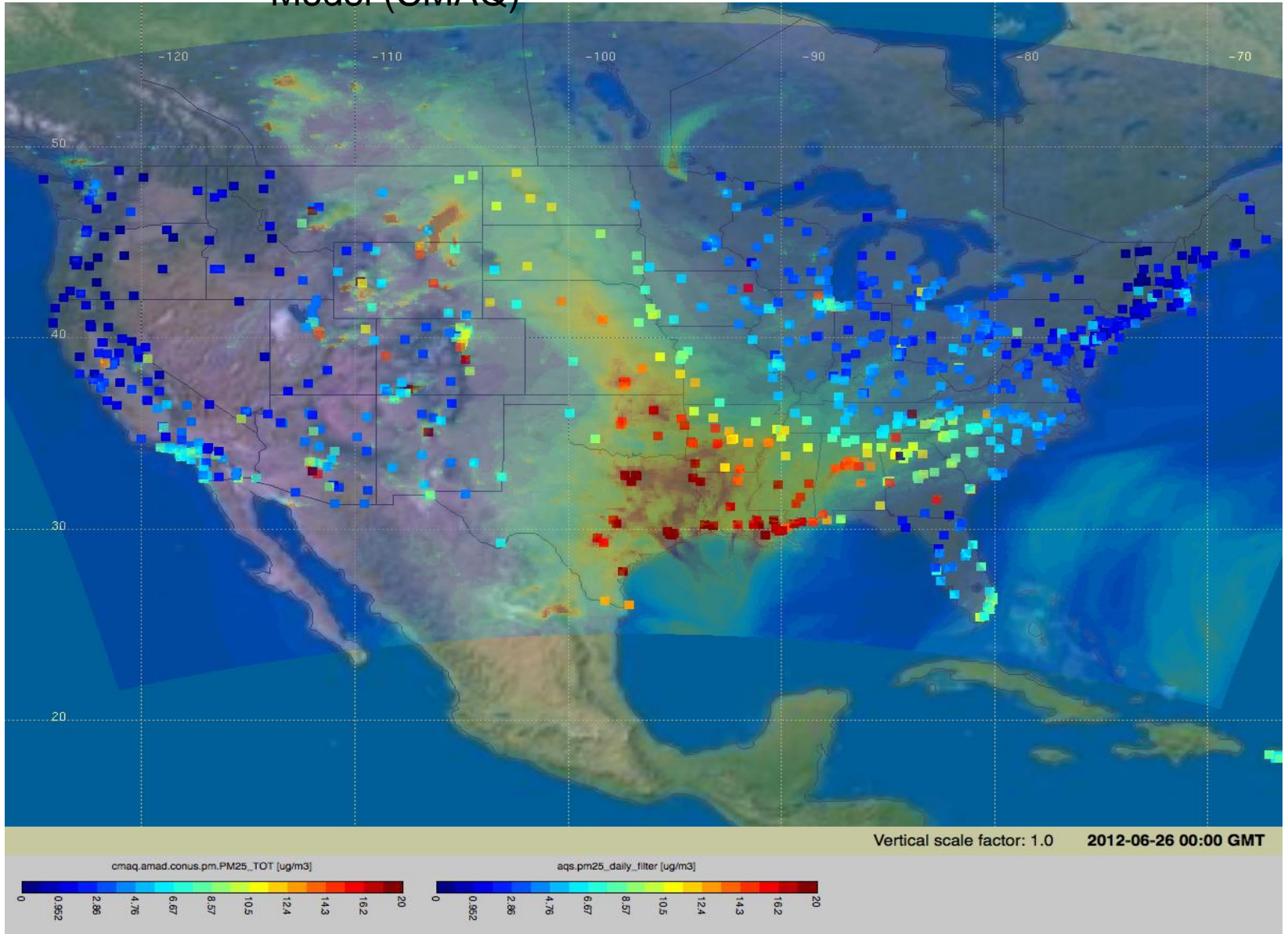




Monthly EPA:  $8.82 \pm 3.64 \mu\text{g m}^{-3}$

Monthly CMAQ:  $7.04 \pm 3.57 \mu\text{g m}^{-3}$  (-20%)

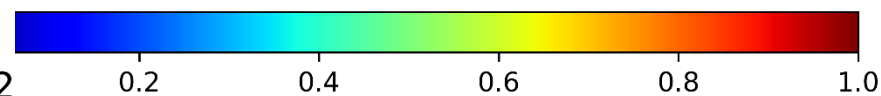
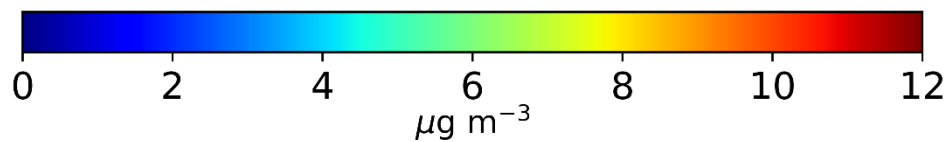
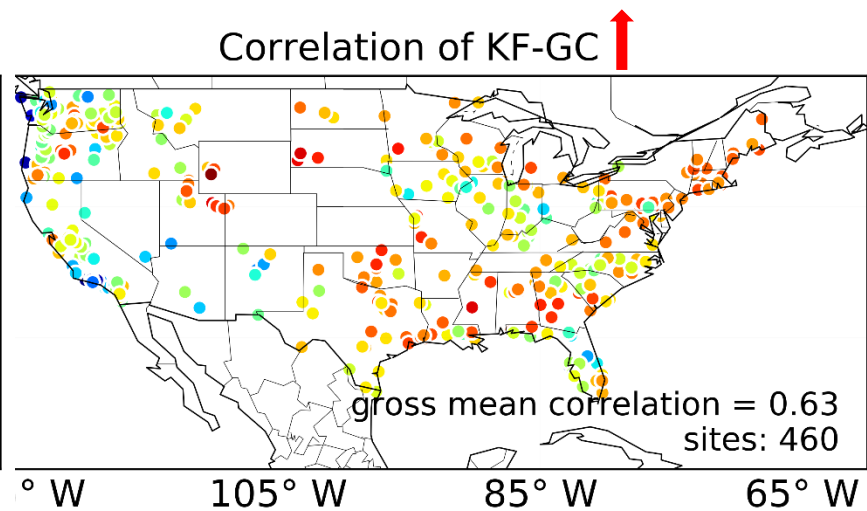
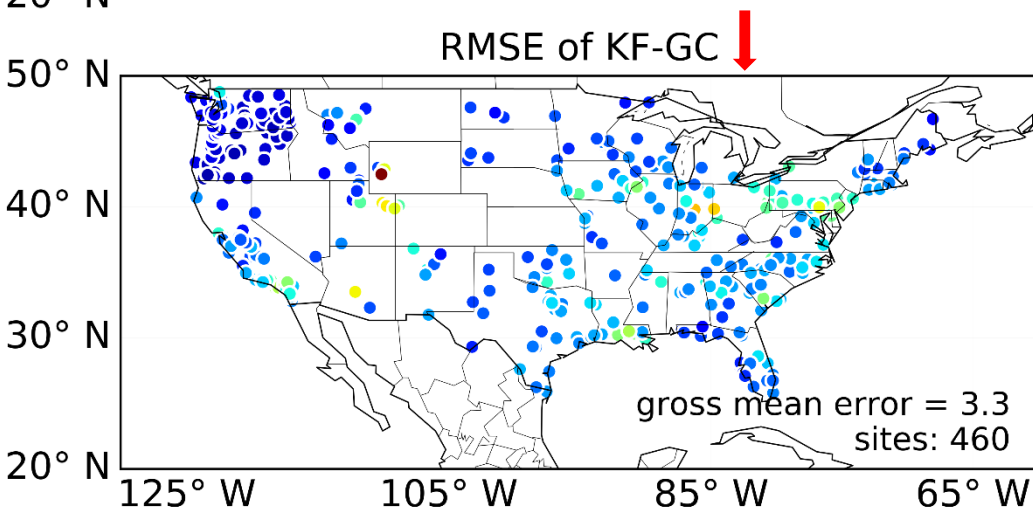
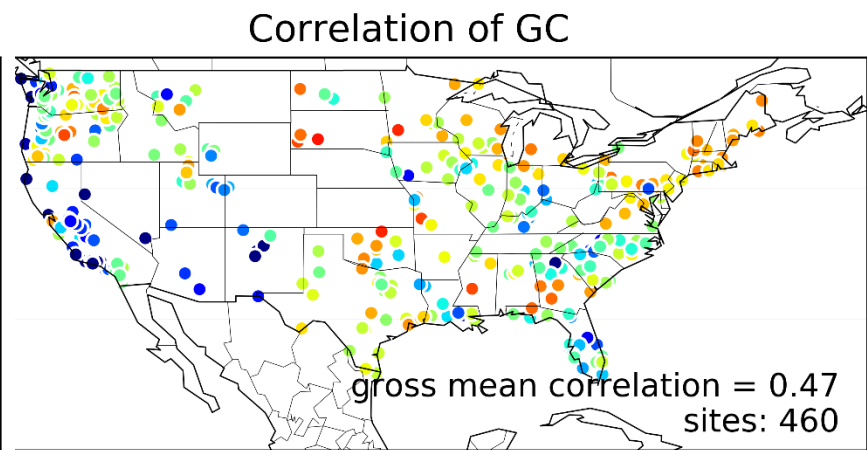
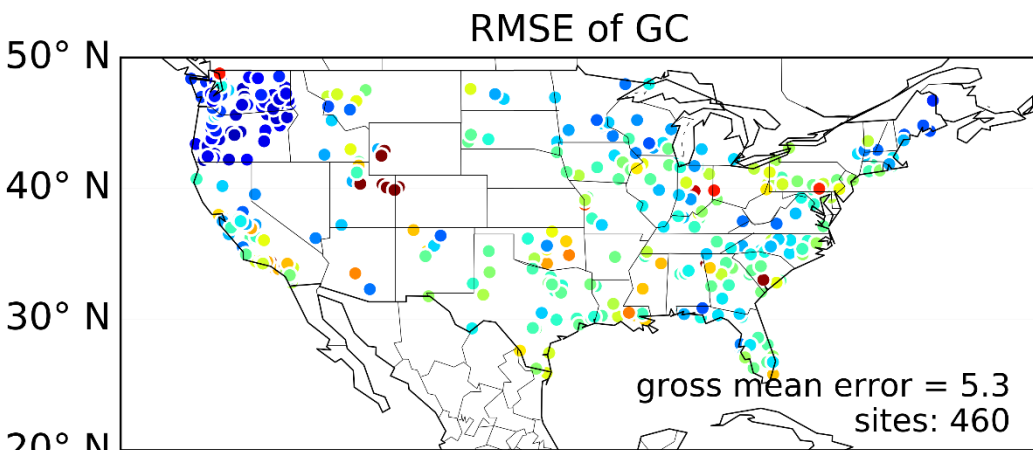
# Model (CMAQ)





# Model configurations

Model	Spatial resolution	Temporal resolution	MET	Chemistry BC	Anthropogenic emission	Fire emission	Biogenic emission	Chemical Mechanism (gas phase)	Aerosol Module
<b>GEOS-Chem</b> (v11-01)	0.5° x 0.667°	Hourly	GEOS 5	GEOS-Chem v11-01 (2x2.5)	NEI 2011	FINN (daily)	MEGAN	HOx-NOx-VOC-O <sub>3</sub> -BrOx	Sulfate-nitrate-ammonium, OC, EC, dust, sea salt
<b>WRF-Chem</b> (v3.6)	12 km	Hourly	WRFv 3.6	Model default	NEI 2011	FLAMBE	MEGAN (basics)	RADM2	MADE/SORGAM
<b>CMAQ</b> (V5.0.2)	12 km	Hourly	WRFV 3.4	GEOS-Chem v8-03-02 with GEOS 5	NEI 2011	BlueSky; Smart Fire Version 2	BEIS	CB05TUCL	AERO6



## Step II: Applying AOD for the forecast

$$PM_{2.5}(\text{estimated}) = PM_{2.5} \times \frac{AOD(\text{sate})}{AOD(\text{model})}$$

## Aerosol module

**GEOS-Chem**: sulfate-nitrate-ammonium, primary and secondary carbonaceous aerosols, mineral dust in four bins, sea salt in fine and coarse modes

***At 35% RH,***

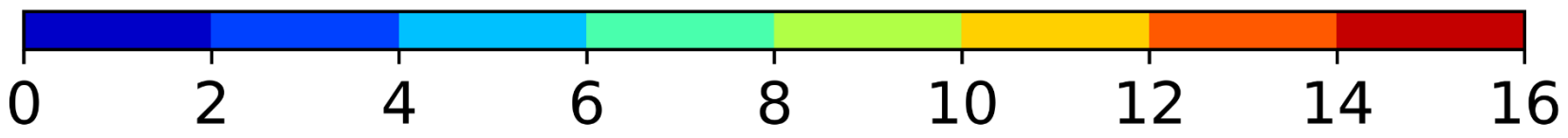
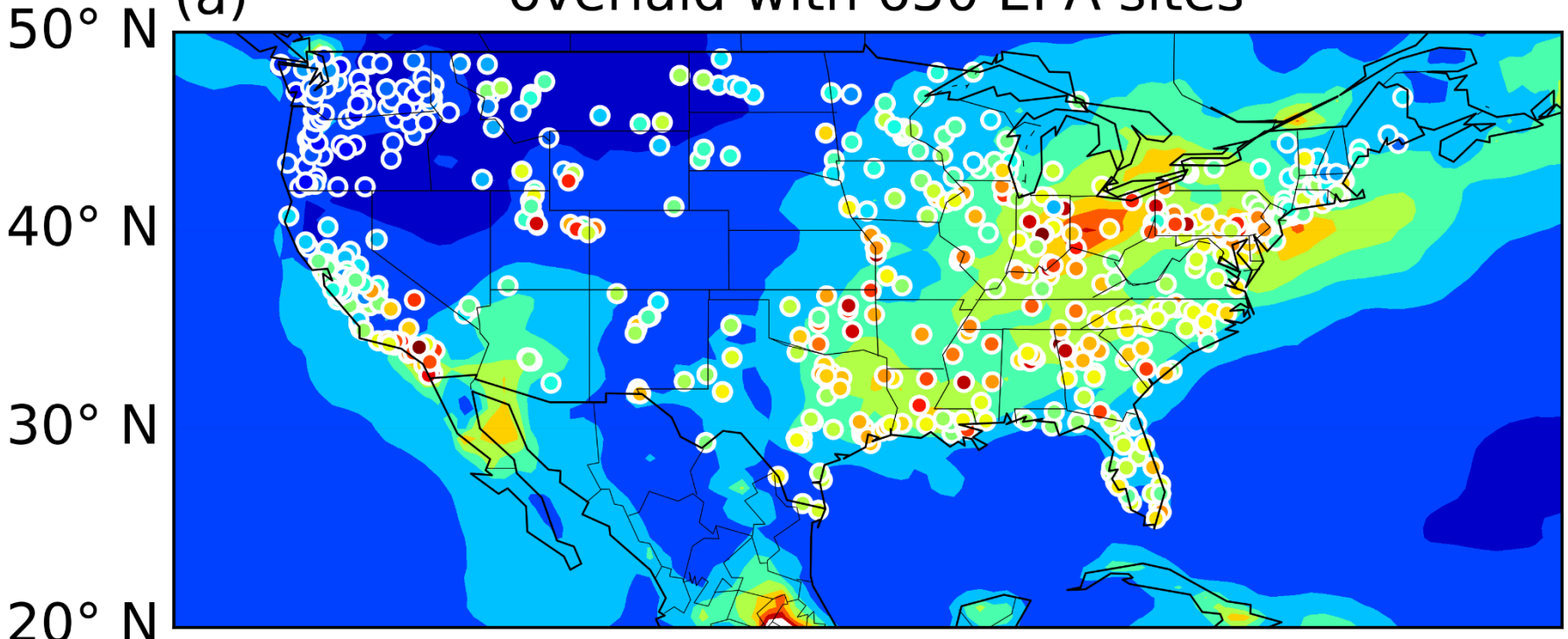
**$PM_{2.5} = 1.33 (NH_4 + NIT + SO_4) + BCPI + BCPO + 2.1 (OCPO + 1.16 OCPI) + 1.16 SOA + DST1 + 0.38 DST2 + 1.86 SALA$**

**WRF-Chem**: sulfate, nitrate, ammonium, BC, organic matters (OM), sea salt, mineral dust and water

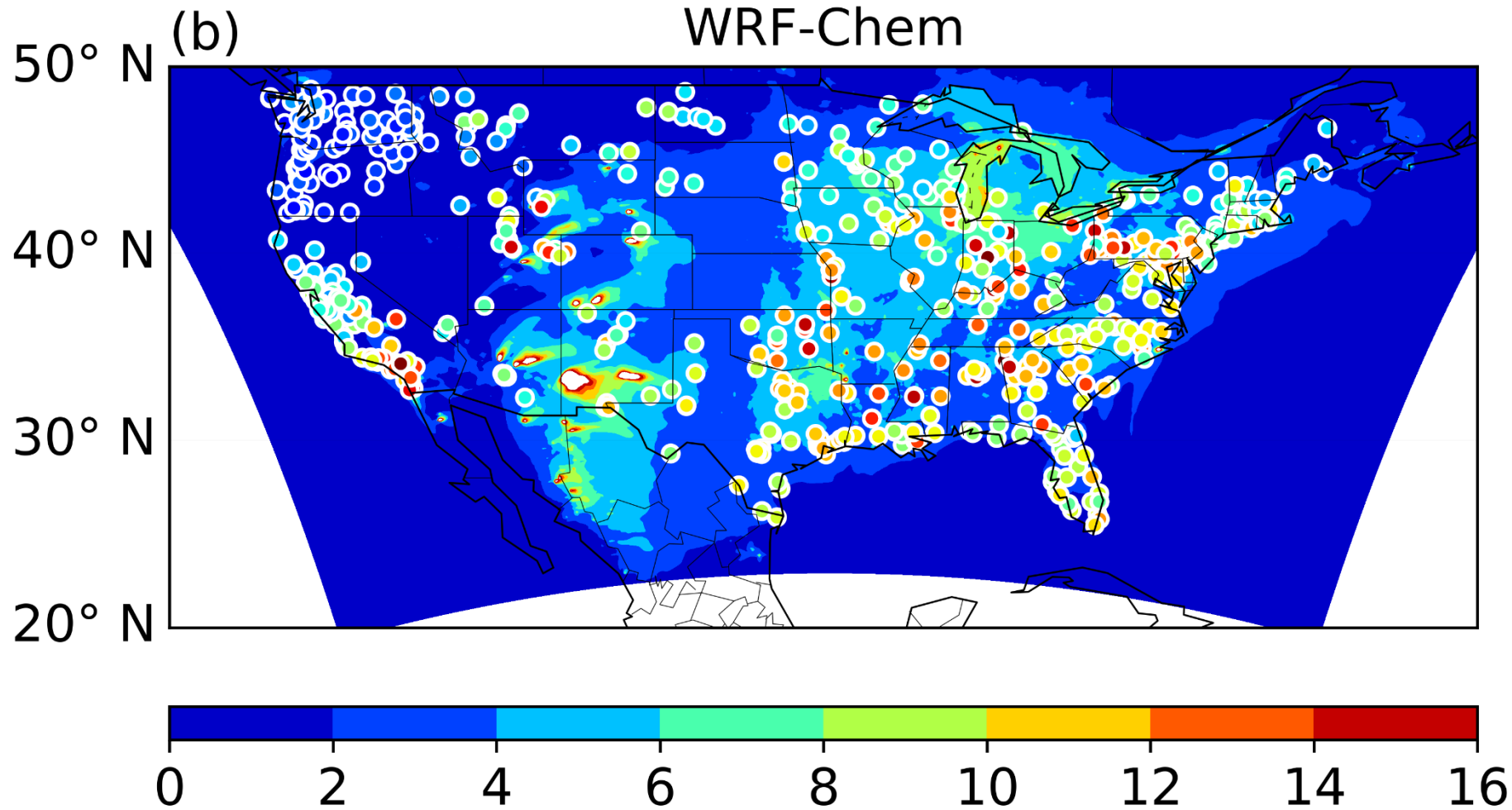
**CMAQ**: sulfate, nitrate, ammonium, water, anthropogenic and biogenic organic carbon, element carbon and other unspecified material of anthropogenic origin

# Monthly GEOS-Chem PM<sub>2.5</sub> overlaid with 650 EPA sites

(a)



Monthly EPA:  $8.82 \pm 3.64 \mu\text{g m}^{-3}$   
Monthly GC:  $6.65 \pm 3.27 \mu\text{g m}^{-3}$  (-25%)  $\mu\text{g m}^{-3}$



Monthly EPA:  $8.82 \pm 3.64 \mu\text{g m}^{-3}$

Monthly WC:  $4.55 \pm 2.16 \mu\text{g m}^{-3}$  (-48%)

# Aerosol size distribution in the model

Modal approach: assume a log-normal distribution for each mode

- Aitken mode :  $< 0.1 \mu\text{m}$
  - Accumulation mode :  $0.1 - 2.5 \mu\text{m}$
  - Coarse mode :  $> 2.5 \mu\text{m}$
- WRF-Chem, CMAQ

Sectional approach: use a discrete number of size bins

-GEOS-Chem dust:  $0.1-1.0, 1.0-1.8, 1.8-3.0$  and  $3.0-6.0 \mu\text{m}$

↓ Calculating optical properties

$0.1-0.18, 0.18-0.3, 0.3-0.6$  and  $0.6-1.0 \mu\text{m}$

## Users' Feedback

- I noticed that, unlike MODIS files, these files contain no CoreMetadata.0 record with swath lon-lat bounds that could be read and compared to a user-specified bounds to quickly checked and skip files without having to read their lon-lat coordinate arrays. But that is minor...
- The main problem is that the Latitude and Longitude variables are still 16-bit integers, which after multiplying by 0.01, which allows for an error of over 1km! I don't think that is good enough for reasonable georeferencing.
- Is there still a plan to eventually have VIIRS file format match MODIS Collection 6 file format?
- Answer: "NASA VIIRS data will be in netcdf4 format instead of modis hdf4 format."
- Steady progress is now being made.



# Objectives

- **PM<sub>2.5</sub> applications**
  - Evaluate and improve the application of the (MODIS-type if possible) VIIRS aerosol product for the operational monitoring of PM<sub>2.5</sub> air quality in EPA's Remote Sensing Information Gateway (RSIG)
  - Subsequently transfer RSIG's PM<sub>2.5</sub> estimates to the CDC's Environmental Public Health Tracking Network (EPHTN)
  - Evaluate and improve VIIRS-RSIG PM<sub>2.5</sub> estimates for enhanced spatial predictions in on-going EPA-CDC EPHTN efforts, currently using CMAQ model output and filter-based PM<sub>2.5</sub> observations from EPA-AQS.
- **Public health (skin cancer research) applications**
  - Incorporate OMPS-based estimates of surface UVB irradiance and erythemal doses into the CDC's EPHTN, and apply them in both public health advisory and skin cancer research.

# Method1: L-BFGS-B

*Cost-function* =

$$\sum_{i=1}^d (a * X_{gc,i} + b * X_{cmaq,i} + c * X_{wrf,i} - Y_{obs,i})^2$$

Where,

- d, the total number of days of data
- i , day
- a,b,c, the weighting factors to be optimized
- $X_{gc,i}$ ,  $X_{cmaq,i}$ ,  $X_{wrf,i}$  , model PM2.5 concentration at day i
- $Y_{obs,i}$ , EPA PM2.5 concentration at day i
- Initial a,b,c: 1./3., 1./3.,1./3.

# Method 2 : Kalman filter (KF) postprocessing predictor bias correction

