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# Spatial evaluation of surface $\text{PM}_{2.5}$ estimates using columnar aerosol optical depth from MODIS retrievals in the western U.S.

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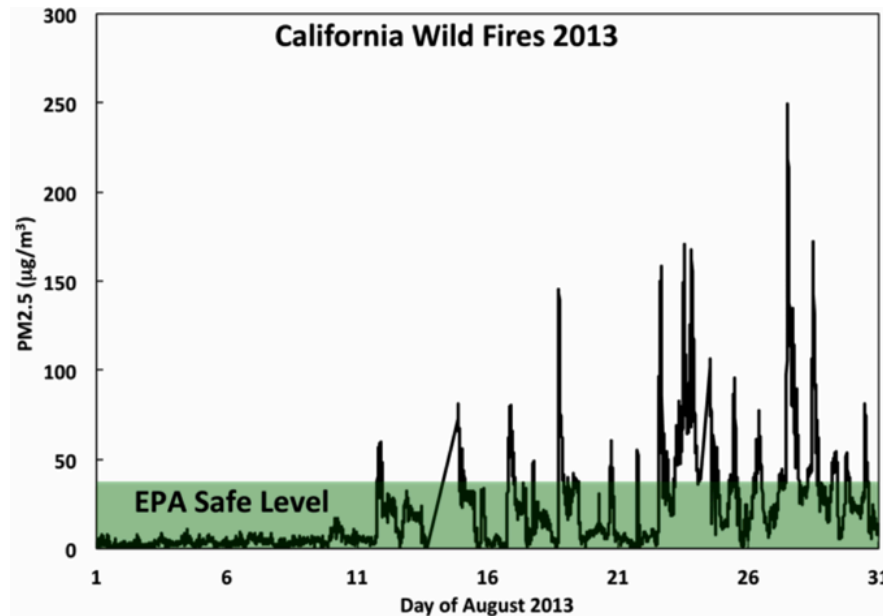
05 October 2015

14<sup>th</sup> Annual CMAS Conference

UNC-Chapel Hill, Chapel Hill, North Carolina, USA

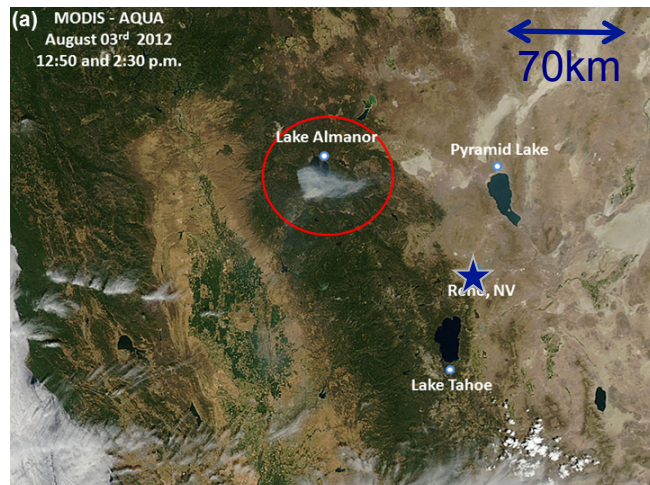


# Motivation

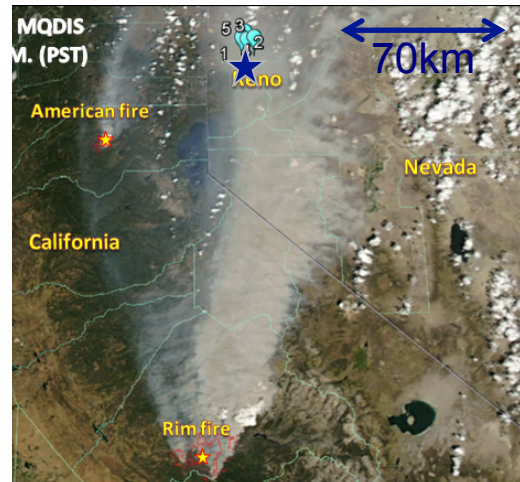


- Human health impacts of wildfire smoke exposure
- Visibility and radiative forcing impacts for climate
- Increasing drought conditions in western U.S. = more fires

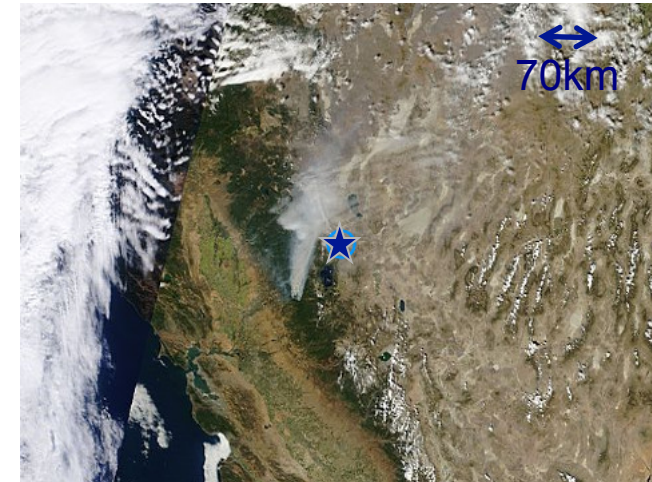
# Motivation



**Chips Fire 2012**  
Aqua - 3 Aug 2012



**Rim Fire 2013**  
Aqua - 22 Aug 2013



**King Fire 2014**  
Terra- 17 Sep 2014

## Uncertainties in aerosol optical depth (AOD) satellite remote sensing algorithm

- Uniformly mixed aerosols of homogeneous composition
- All aerosols are contained within the boundary layer
- Surface reflectance: Dark Target (dark) & Deep Blue (bright)



# Objectives and Hypotheses

## Objectives

- Determine uncertainty of satellite *AOD* using ground-based *AOD*
- Investigate the relationship between columnar *AOD* &  $PM_{2.5}$
- Use models and upper air data to understand aerosol transport from wildfire smoke plumes
- Develop daily, spatially-resolved surface *PM* concentration fields

## Hypotheses

- Complex atmospheric transport will lead to uncertainties in satellite retrieval algorithms
- Columnar *AOD* and surface  $PM_{2.5}$  will not be linearly correlated
- Wildfire smoke will improve sensitivity of satellite retrieval

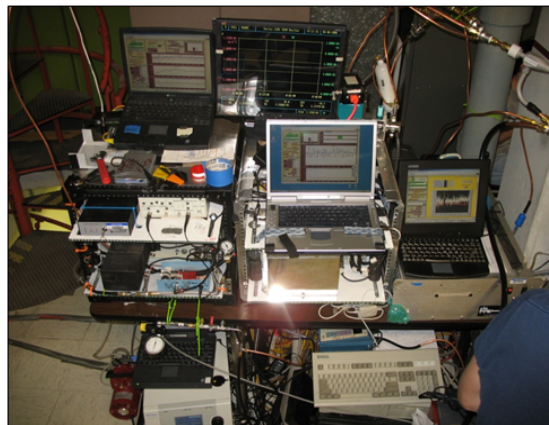


# Approach

- Collect MODIS satellite retrievals for *AOD*
- Collect NASA AERONET ground-based sunphotometry *AOD* data
- Collect  $PM_{2.5}$  concentration data from monitoring networks
- Collect balloon sounding data
- UNR Photoacoustic and Integrated Nephelometer (PIN) measurements
- Evaluate spatial satellite retrivals for *AOD* using AERONET data
- Investigate atmospheric physics using balloon and PIN data



Cimel CE-318 Sun photometer



Photoacoustic and Integrated Nephelometer



Beta Attenuation Monitor ( $PM_{2.5}$ )

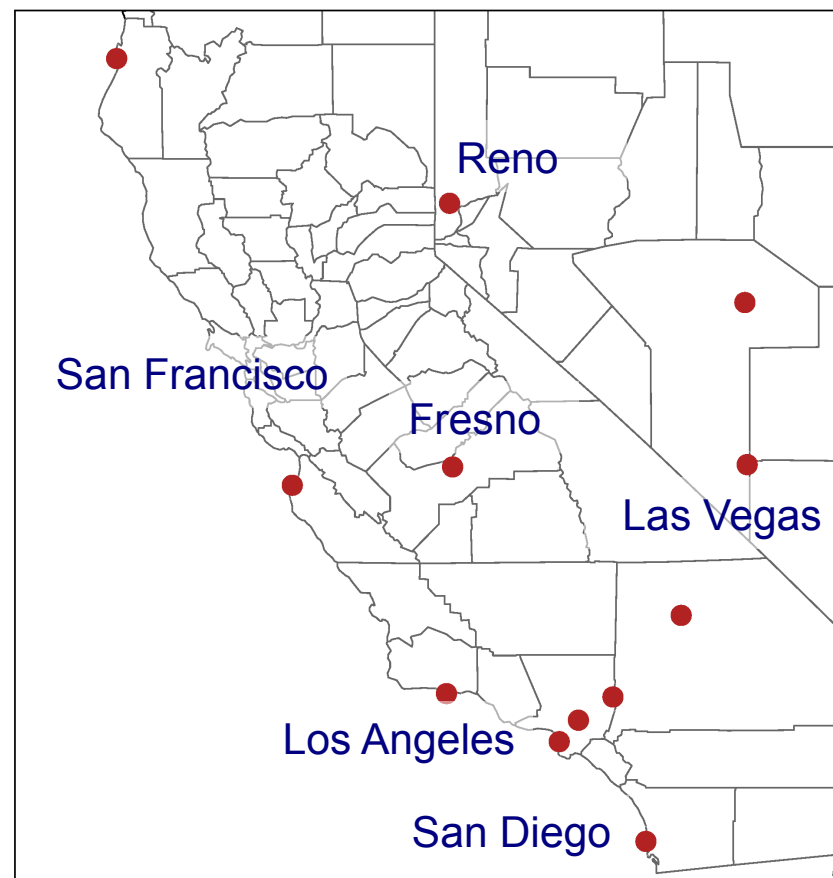
# Satellite Domain and AOD Monitors

## Satellite Domain



- 10-km horizontal resolution
- One swath two times per day

## AERONET Locations



- 12 AOD monitors
- Hourly data during daylight



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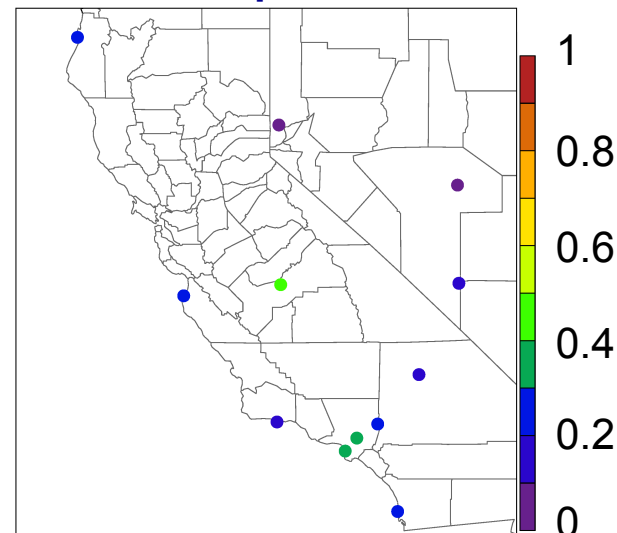
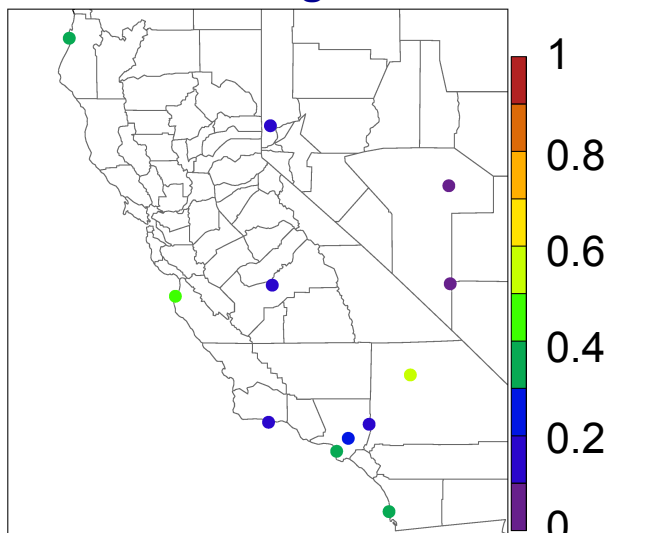
# Spatial $R^2$ and Normalized Mean Bias (NMB)

Terra (AM): Three Years, Non-fire Periods

Dark Target

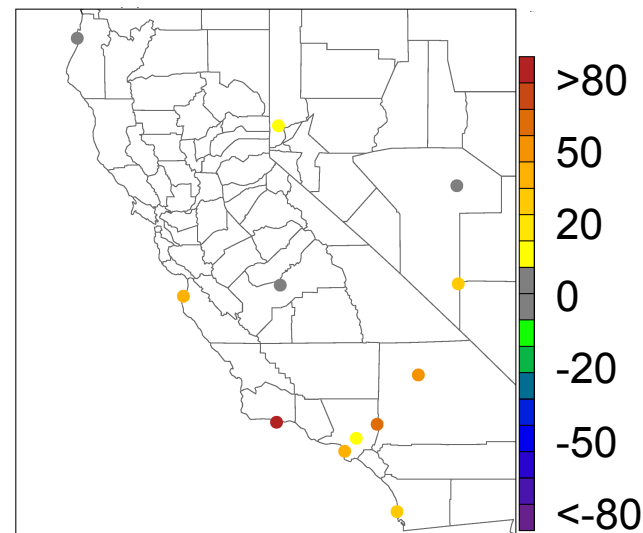
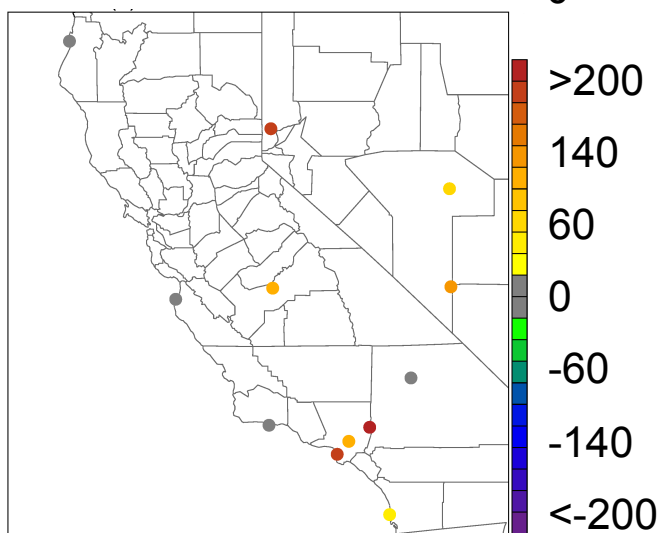
Deep Blue

Correlation ( $R^2$ )



Bias (NMB %)

$$\text{NMB} = \frac{\sum_1^n (P - O)}{\sum_1^n (O)} * 100$$





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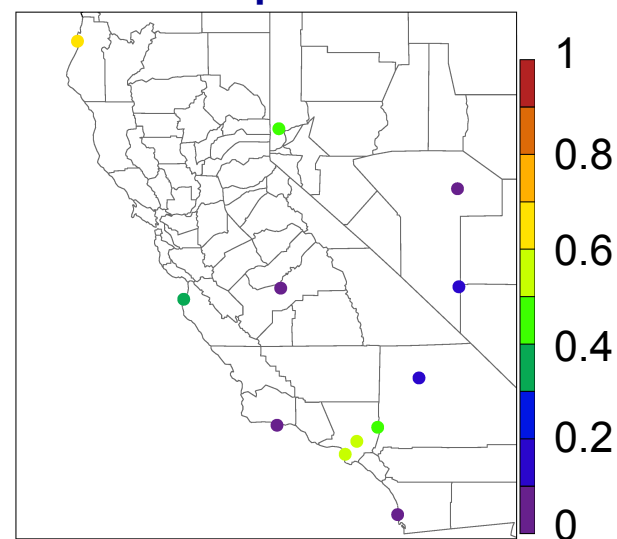
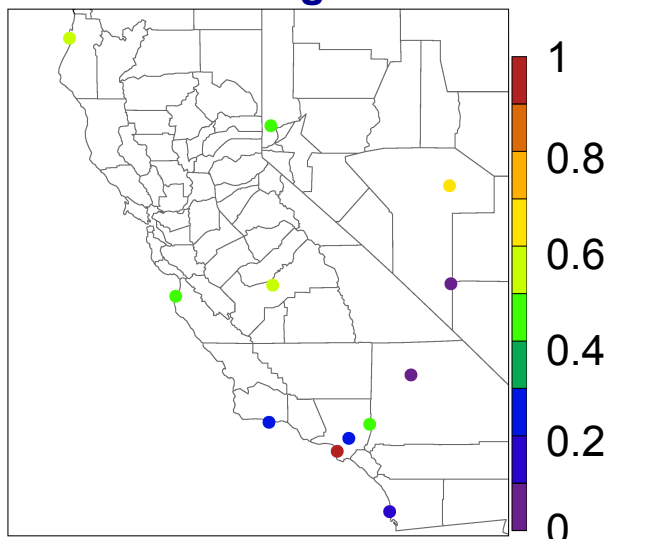
# Spatial $R^2$ and Normalized Mean Bias (NMB)

Terra (AM): Three Years, Fire Periods

Dark Target

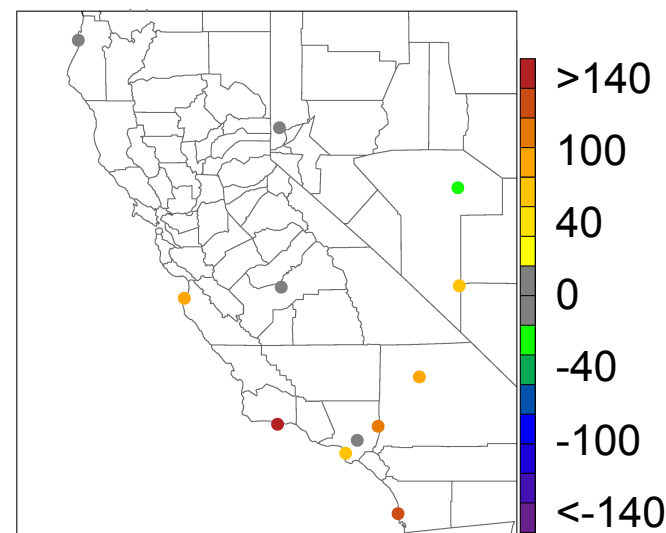
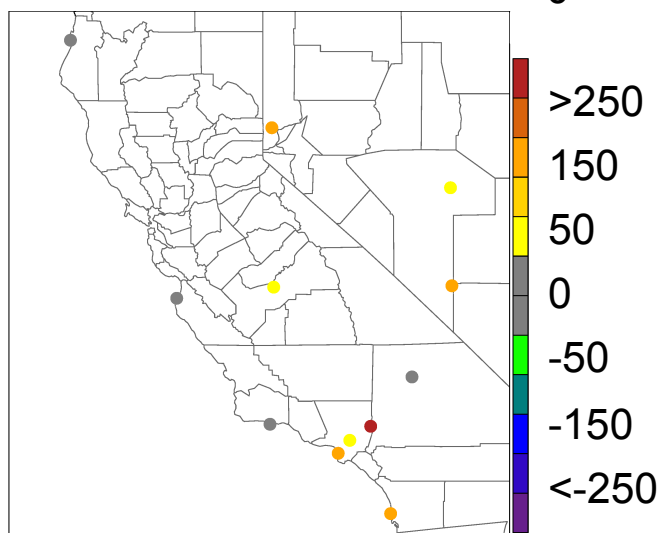
Deep Blue

Correlation ( $R^2$ )



Bias (NMB %)

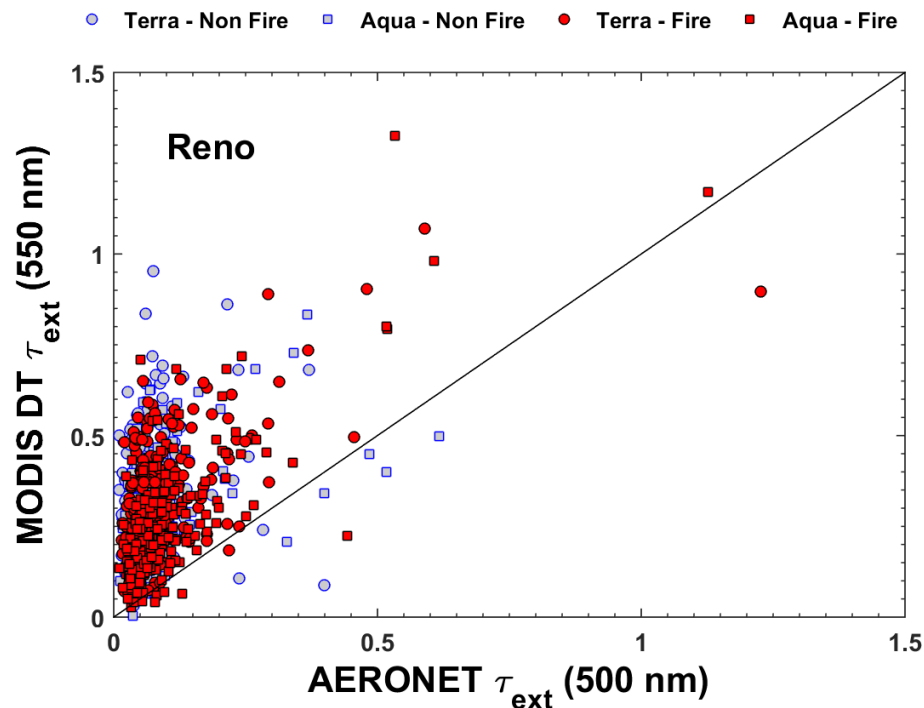
$$\text{NMB} = \frac{\sum_1^n (P - O)}{\sum_1^n (O)} * 100$$



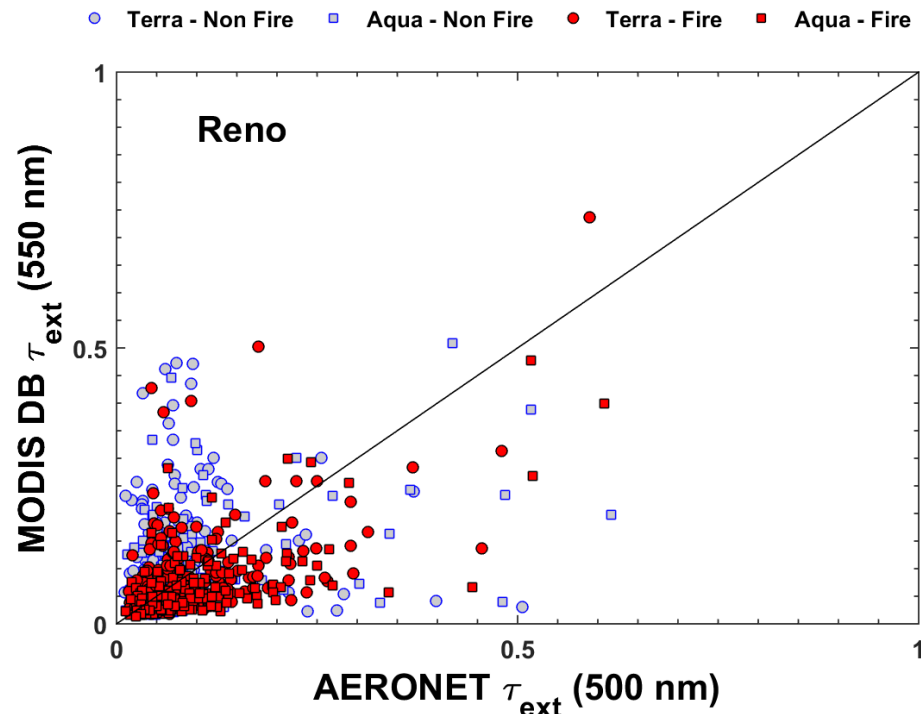


# Reno: AERONET versus MODIS AOD

## Dark Target



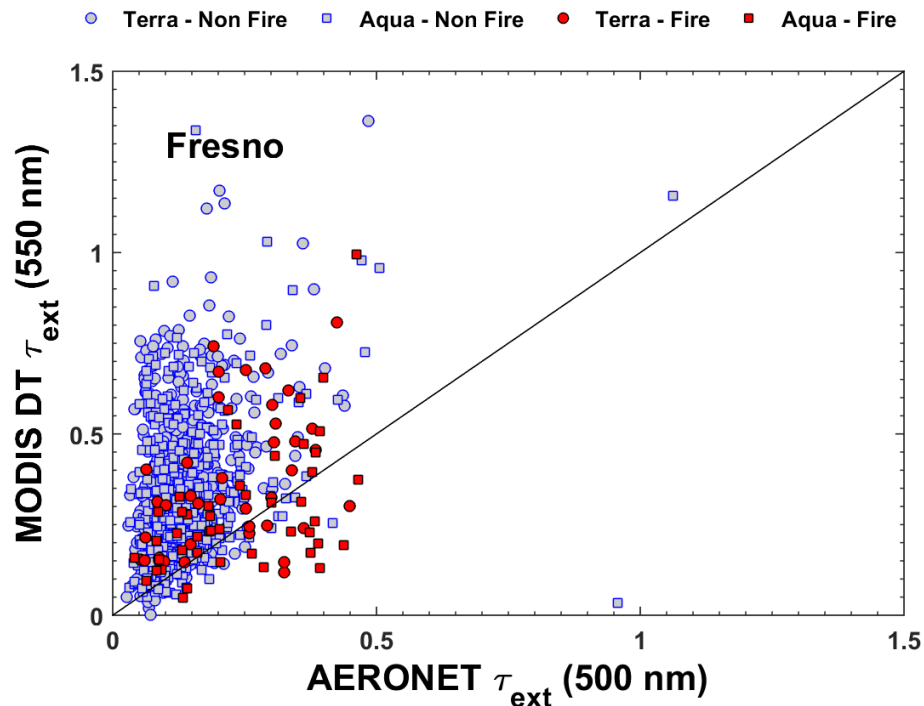
## Deep Blue



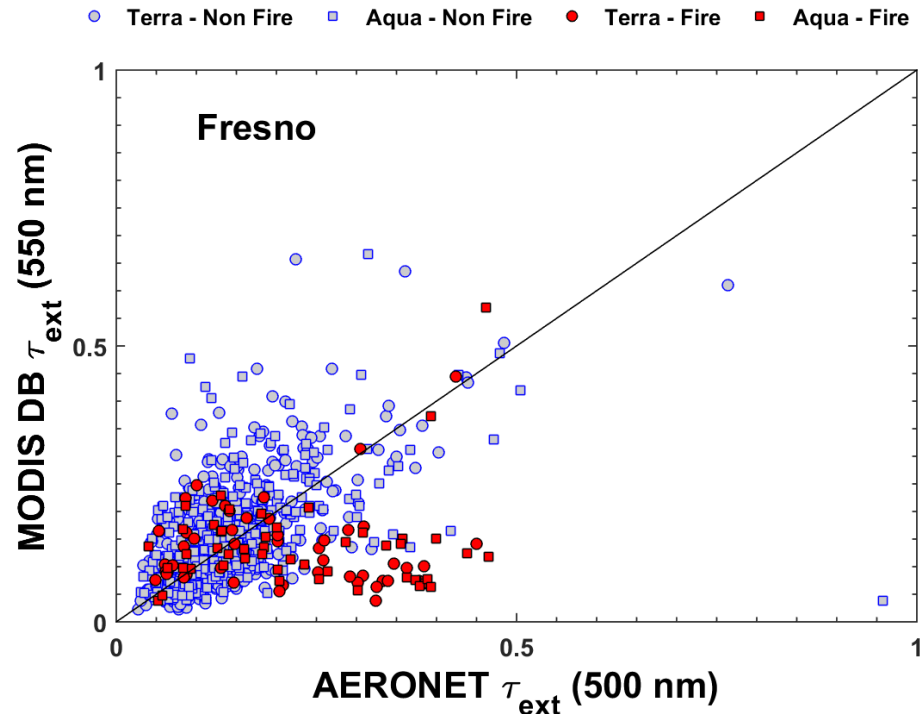
- Deep Blue for bright surfaces, Reno = Desert
- Deep Blue under predicts *AOD* for fire periods

# Fresno: AERONET versus MODIS AOD

## Dark Target



## Deep Blue

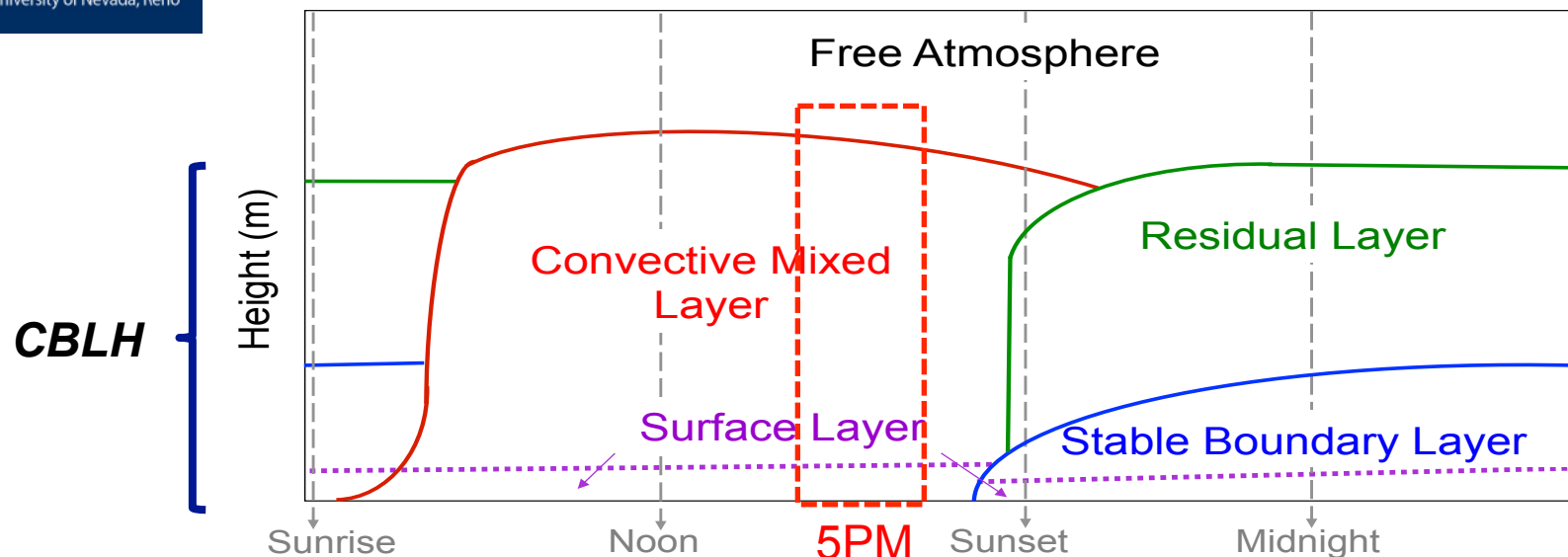


- Deep Blue better correlation, Fresno = Desert?
- Deep Blue under predicts *AOD* for fire periods

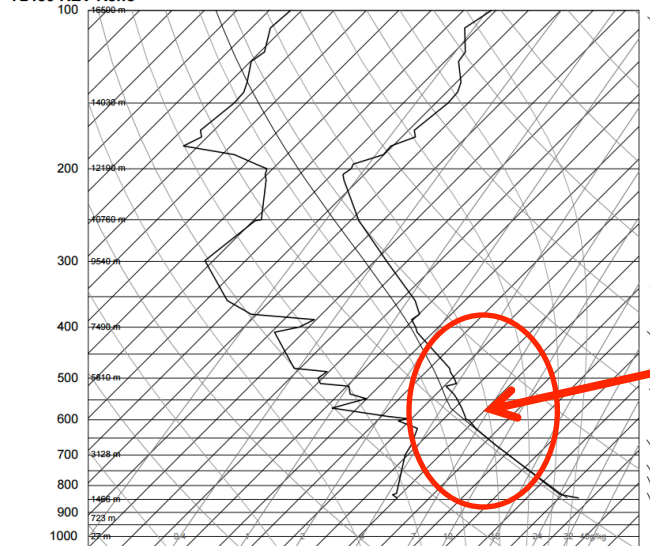


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# Convective Boundary Layer Height (CBLH)



72489 REV Reno

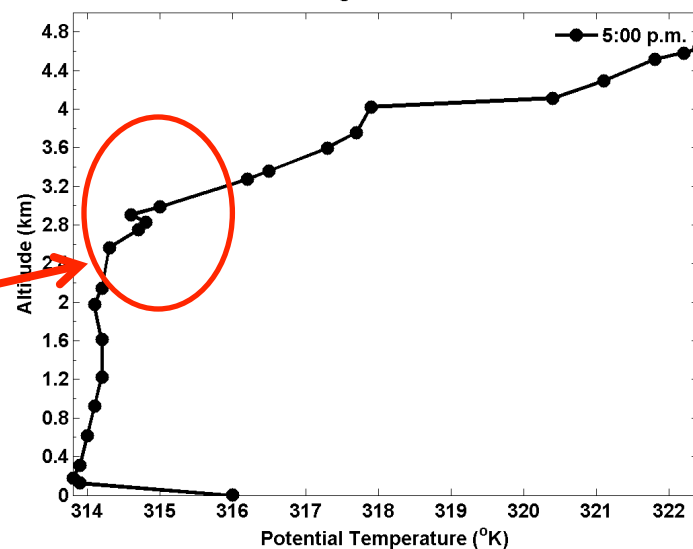


SLAT 39.56  
SLON 1516  
SHOW -9999  
LFTV 2.51  
LFTV 2.13  
SMET -9999  
KNR -9999  
CTOT -9999  
VTOT -9999  
TOTL -9999  
CAPE 0.00  
CAPV 0.00  
CNS 0.00  
CINV 0.00  
EQV -9999  
EQTV -9999  
LFTV -9999  
LFTV -9999  
BRCH 0.00  
BRCV 0.00  
LCLT 267.0  
LCLP 566.3  
MLTH 314.1  
MLMR 4.32  
THCK 5783  
PWAT 11.33

00Z 24 Aug 2013

University of Wyoming

Reno  
August 23 2013

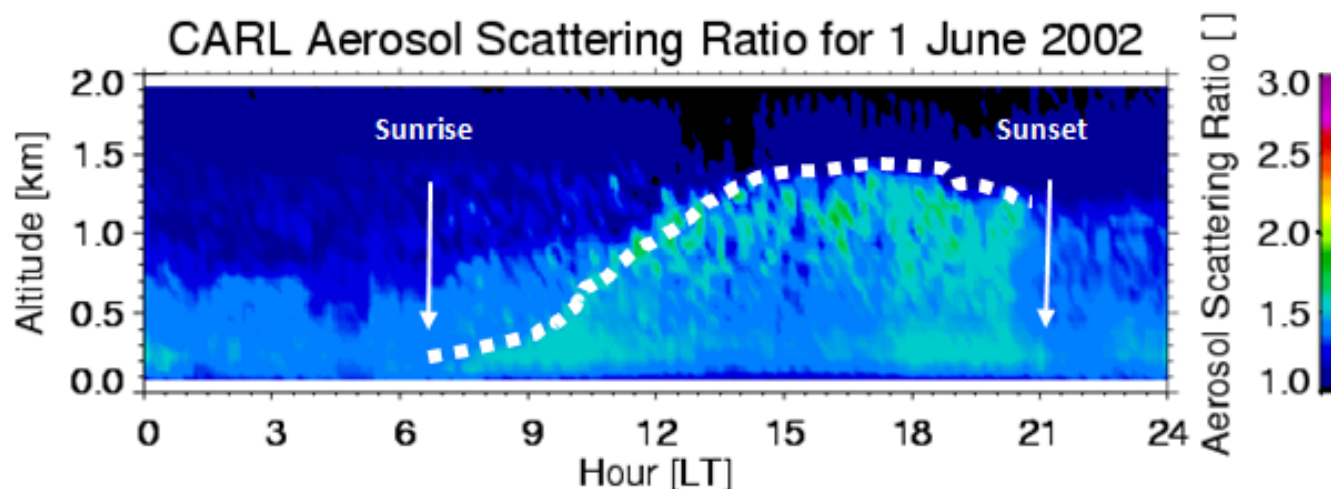


# Apparent Optical Height (AOH)

**Estimates the height that aerosols can reach in the atmosphere**

- In-situ photoacoustic and reciprocal nephelometer: Surface  $\beta_{\text{ext}}$
- Ground-based sunphotometry: Columnar  $AOD$  ( $\tau_{\text{ext}}$ )

$$AOH(\lambda) = \tau_{\text{ext}}(\lambda) / \beta_{\text{ext}}(\lambda)$$

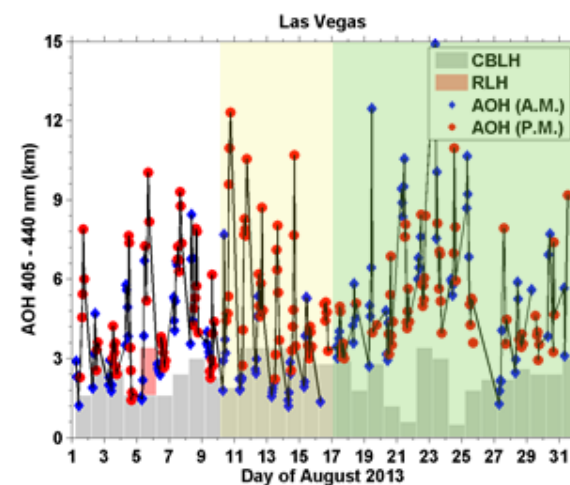
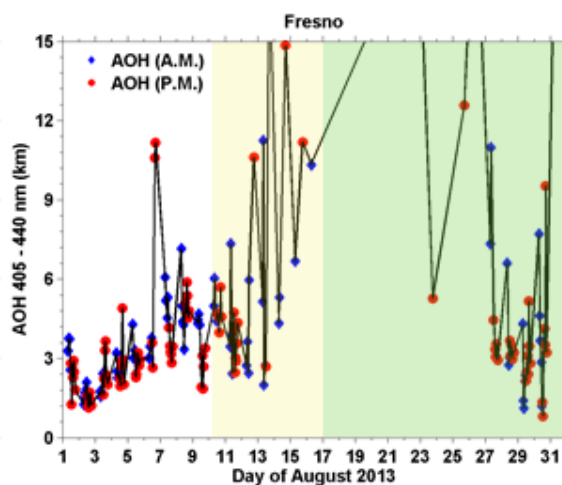
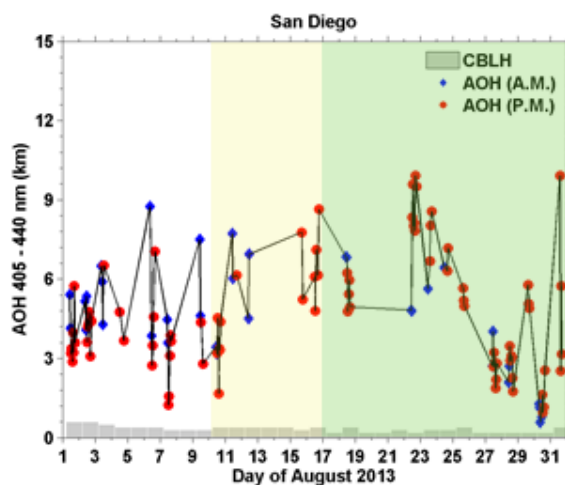
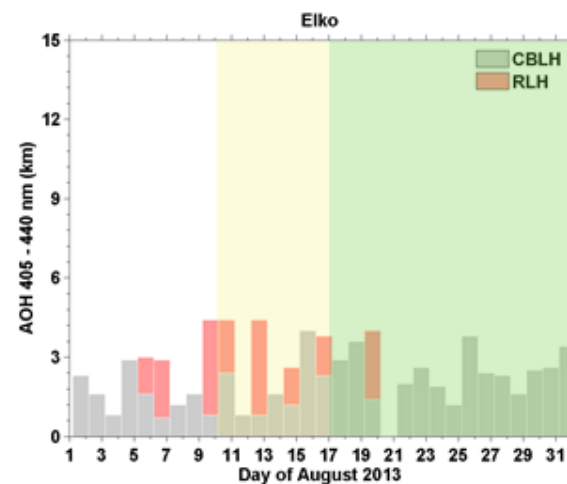
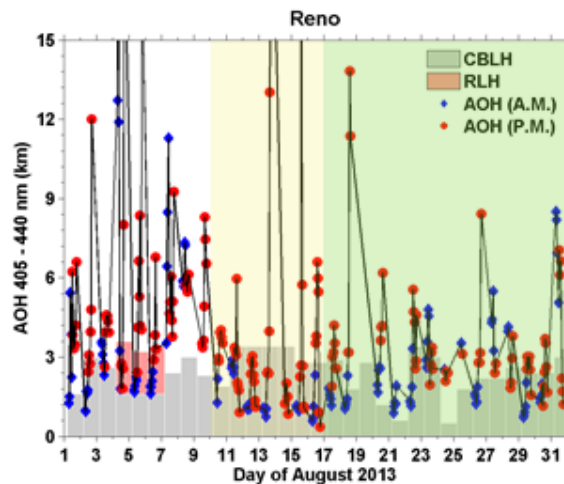
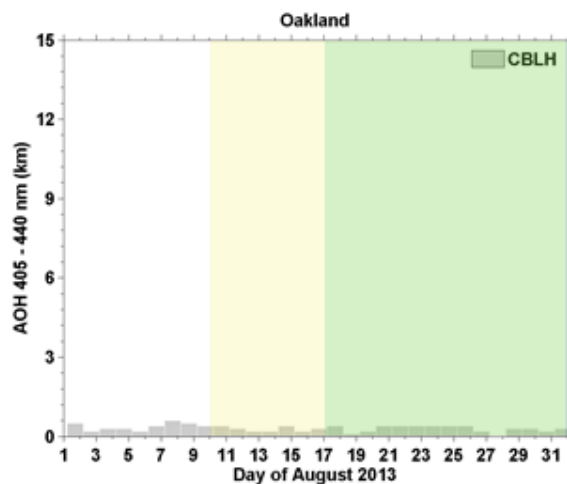


Raman Lidar Picture of the Convective Mixed Layer at the DOE ARM site in North Central Oklahoma. (Courtesy of Dr. David Turner)





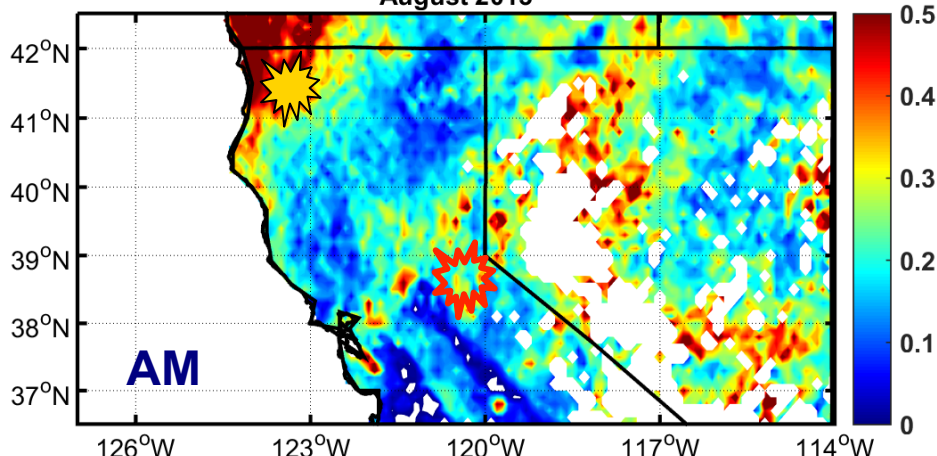
# Vertical Profiles: *CBLH* and *AOH*



# MODIS AOD: August 2013 - Rim Fire

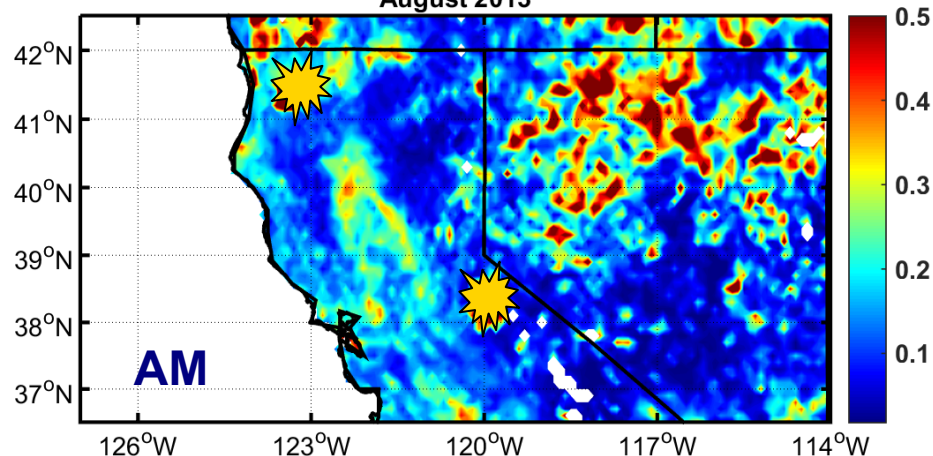
## Dark Target

Terra AOD corrected land (550 nm). Col. 6  
August 2013

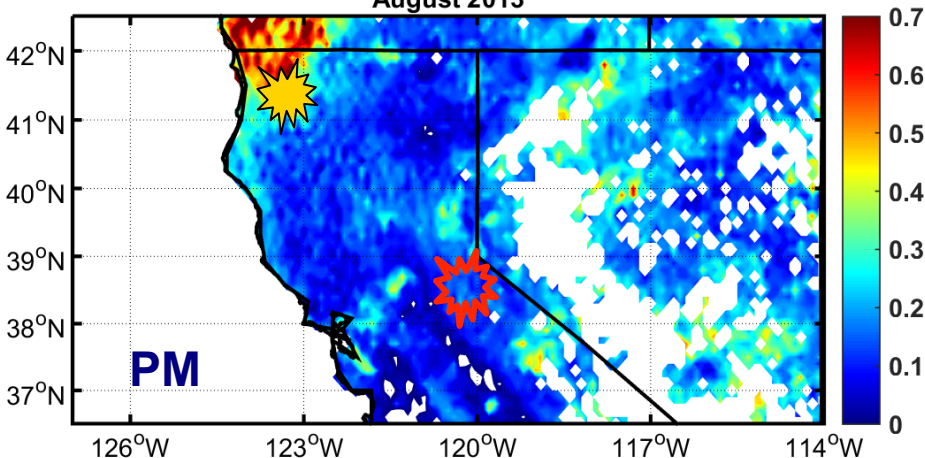


## Deep Blue

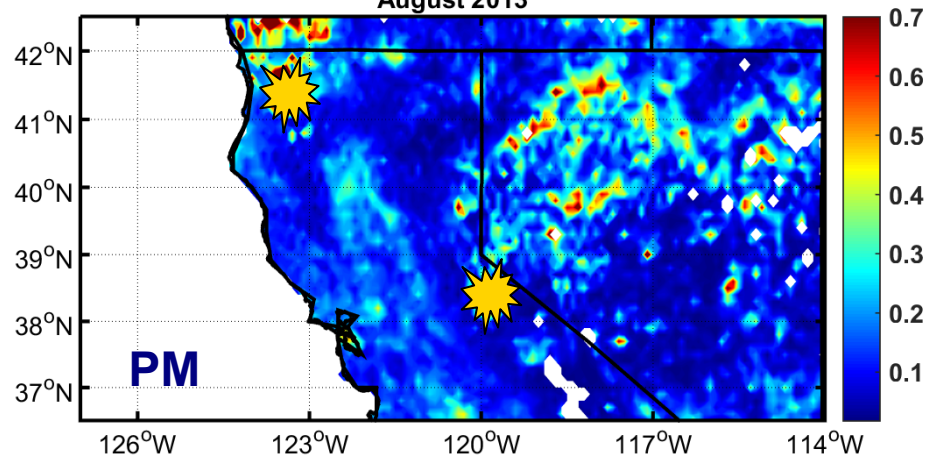
Terra AOD deep blue land (550 nm). Col. 6  
August 2013



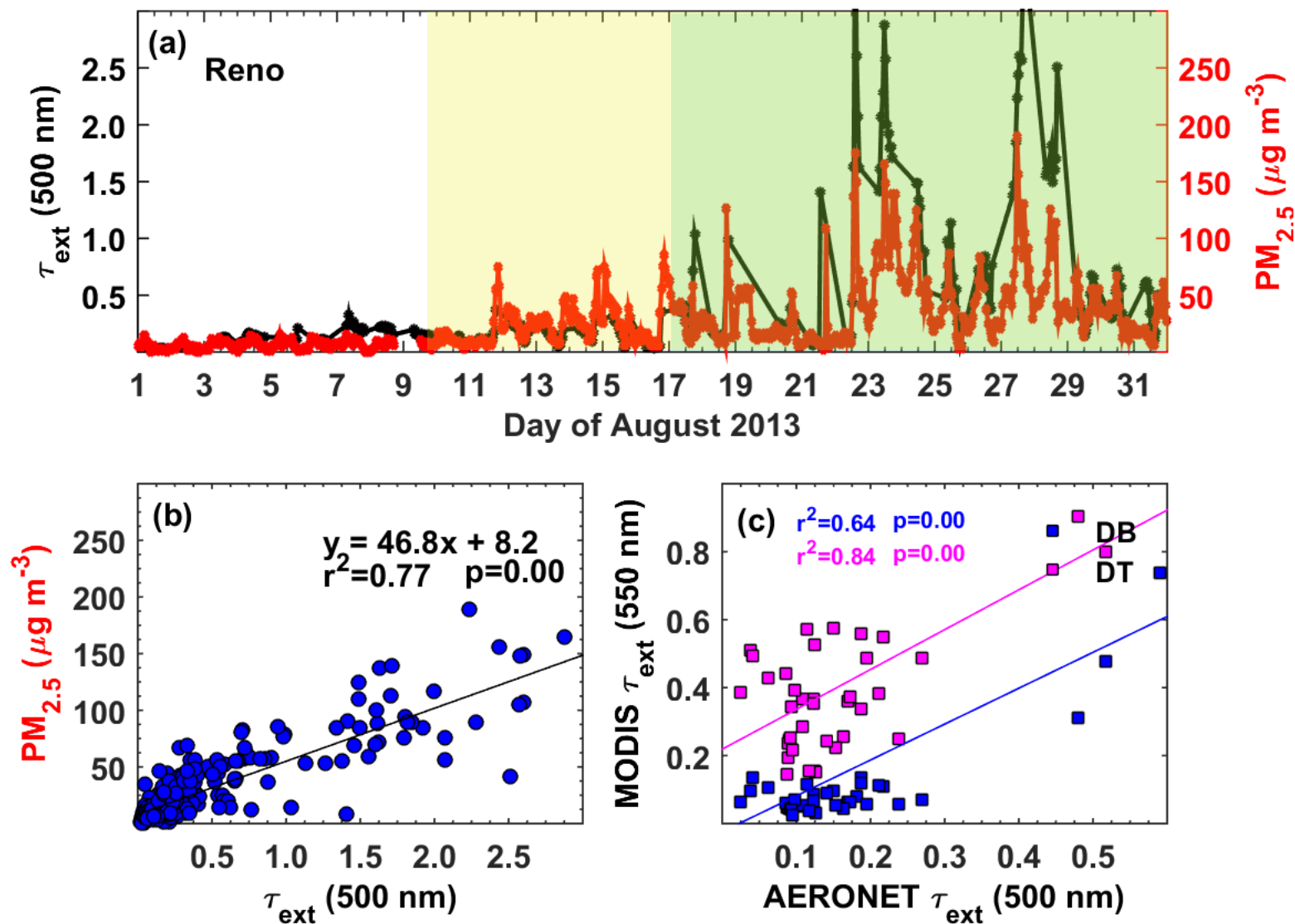
Aqua AOD corrected land (550 nm). Col. 6  
August 2013



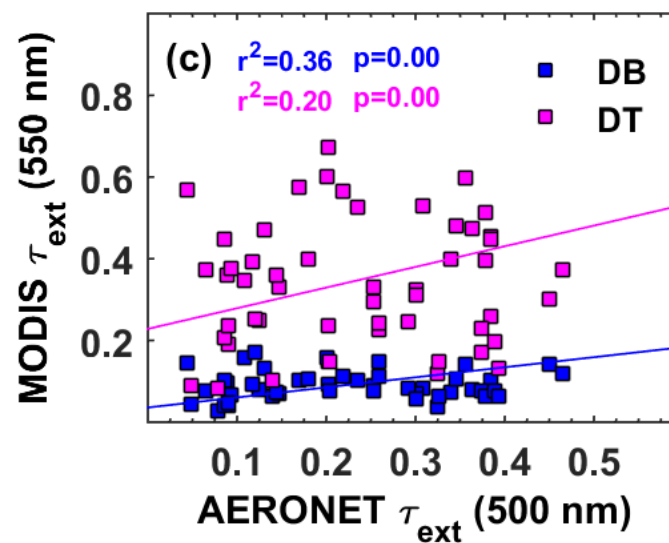
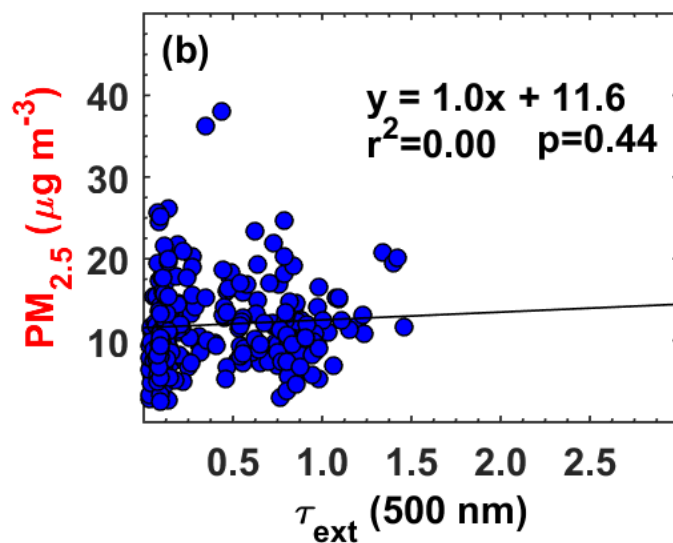
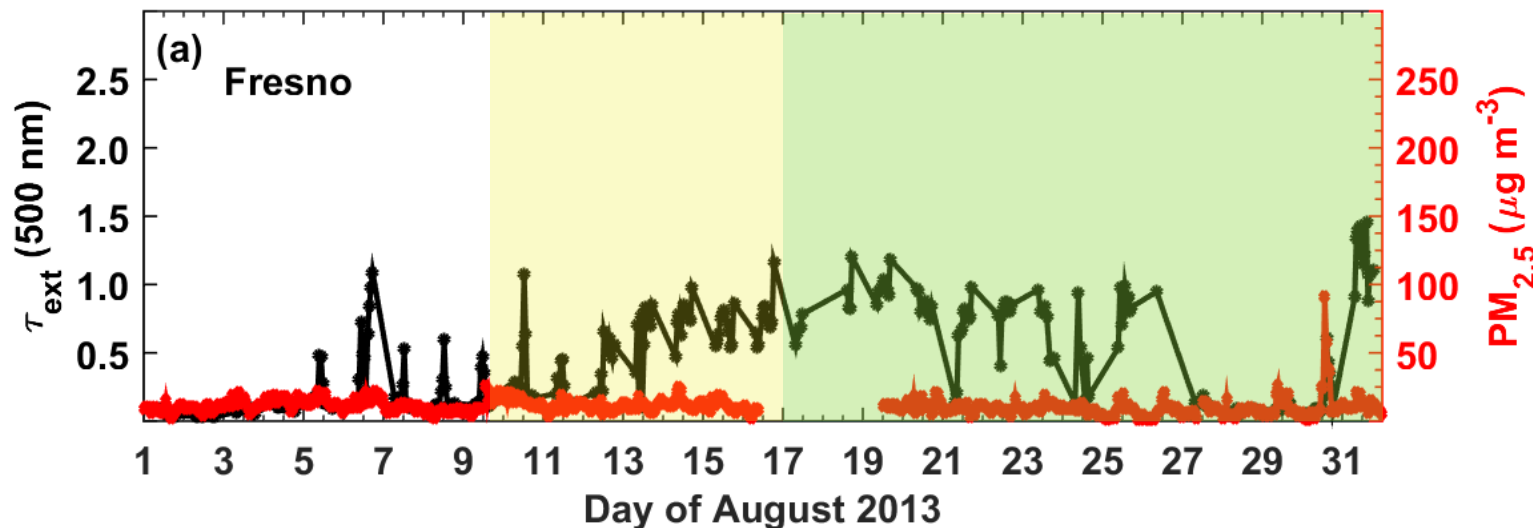
Aqua AOD deep blue land (550 nm). Col. 6  
August 2013



# Reno: $PM_{2.5}$ , AERONET and MODIS AOD



# Fresno: $PM_{2.5}$ , AERONET and MODIS AOD







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# HYSPLIT Back Trajectories: 31 Aug 2013

## 24 hour, NAM 12-km

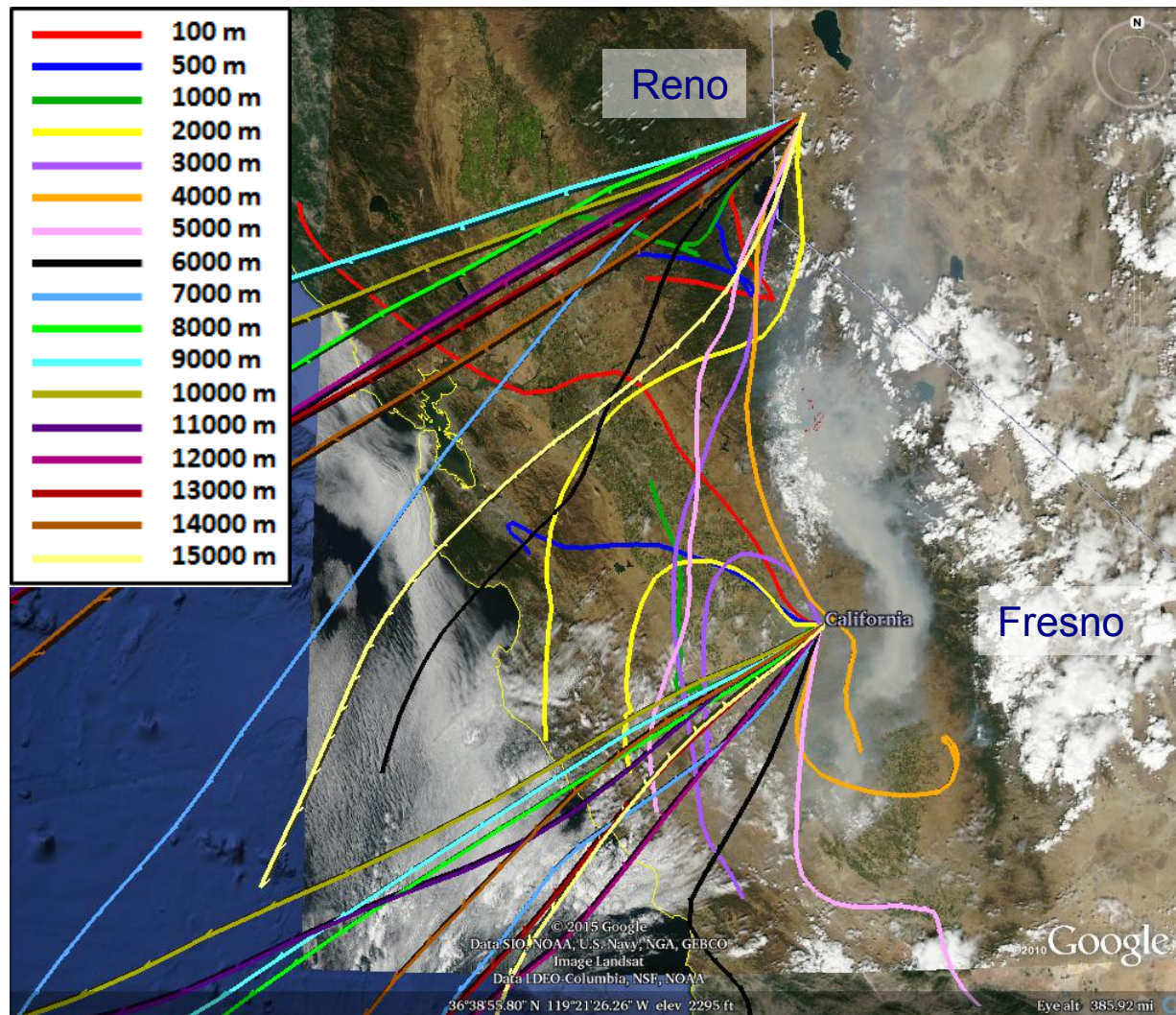
### Reno:

100m & 2000m  
near plume

### Fresno:

4000m & 5000m  
near plume

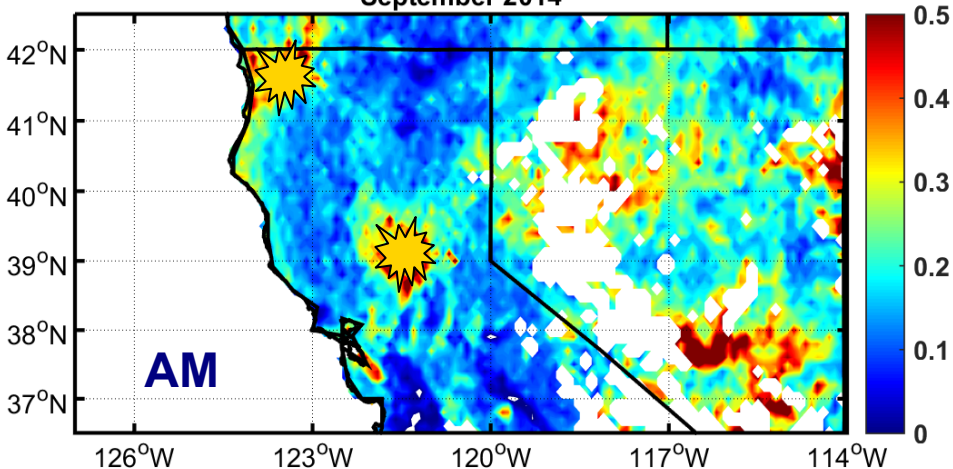
100m & 200m  
west of plume,  
clean air



# MODIS AOD: September 2014 - King Fire

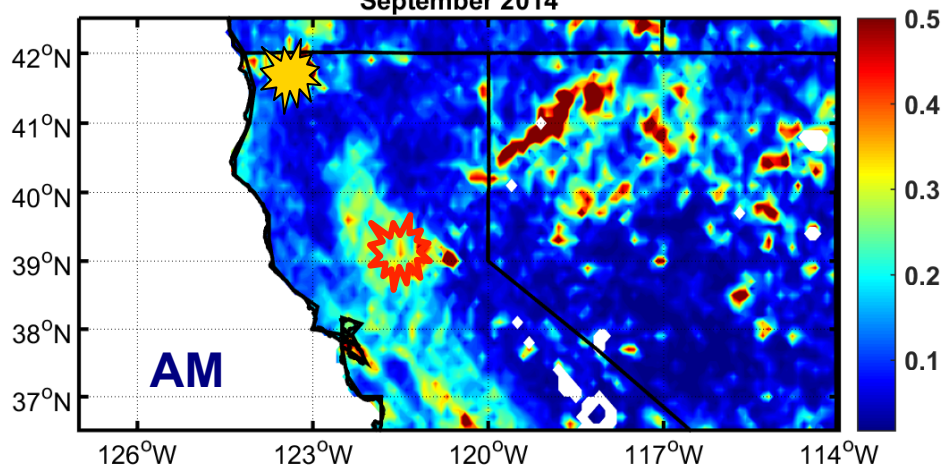
## Dark Target

Terra AOD corrected land (550 nm). Col. 6  
September 2014

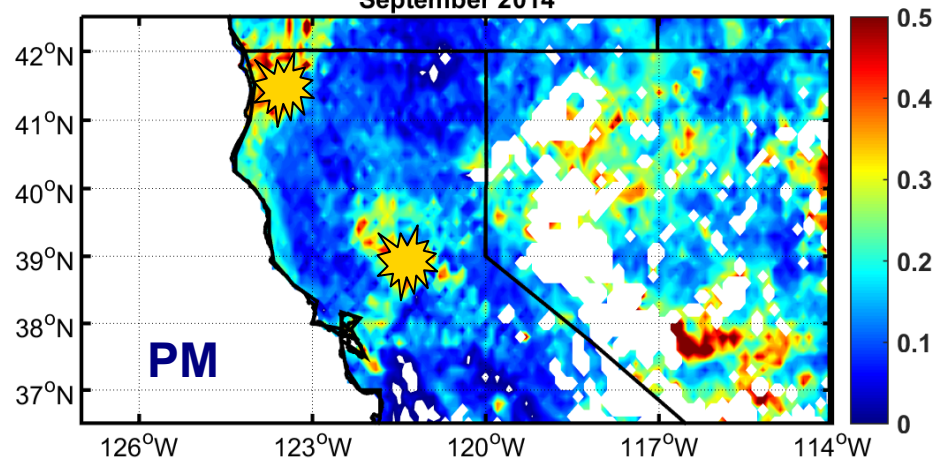


## Deep Blue

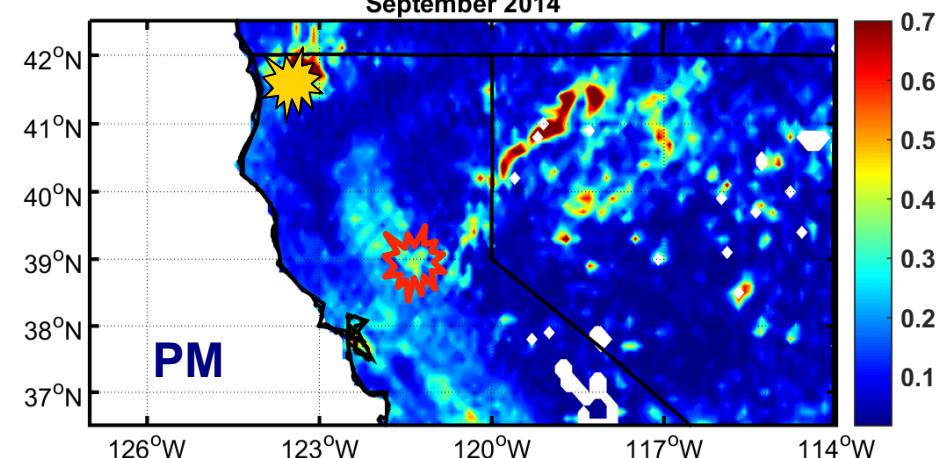
Terra AOD deep blue land (550 nm). Col. 6  
September 2014



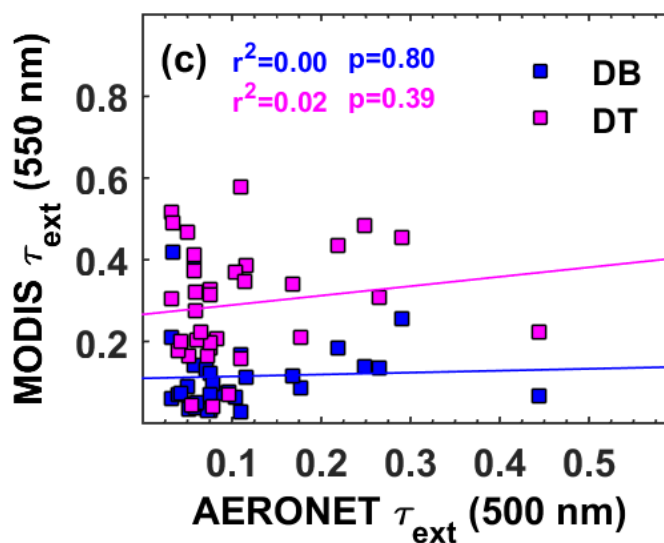
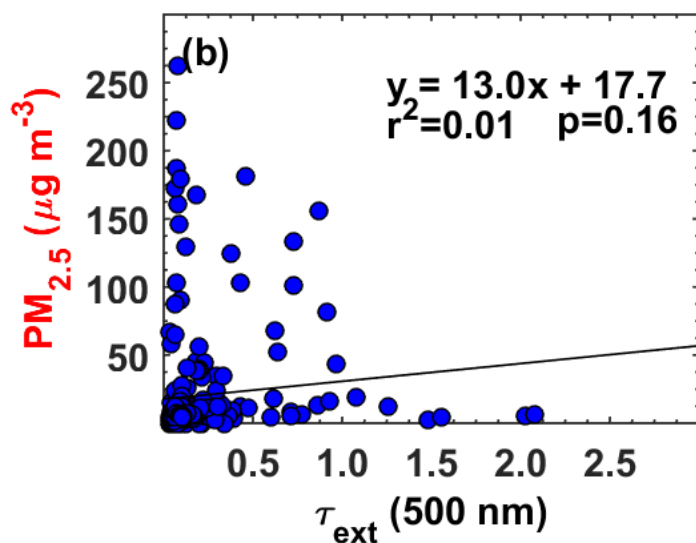
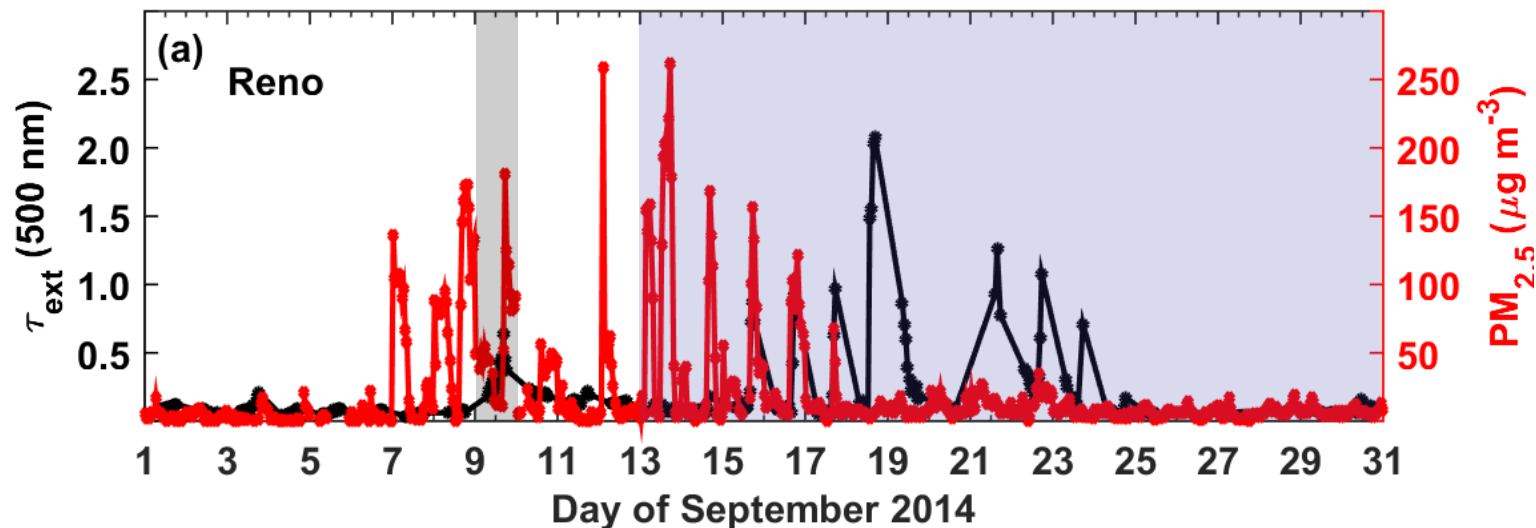
Aqua AOD corrected land (550 nm). Col. 6  
September 2014



Aqua AOD deep blue land (550 nm). Col. 6  
September 2014



# Reno: $PM_{2.5}$ , AERONET and MODIS AOD



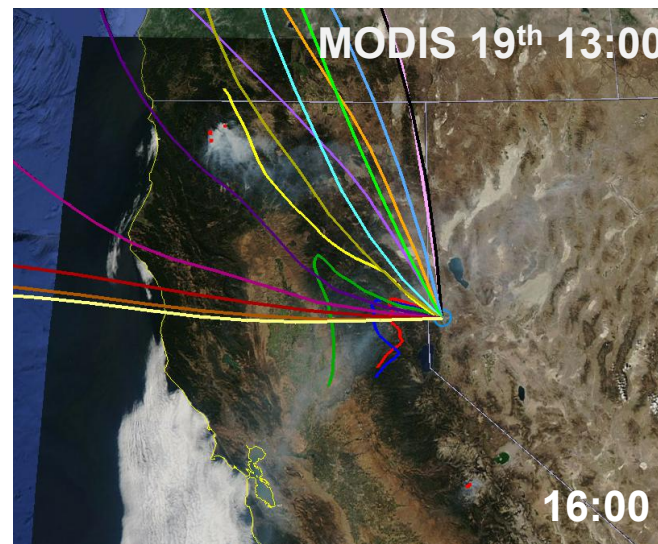
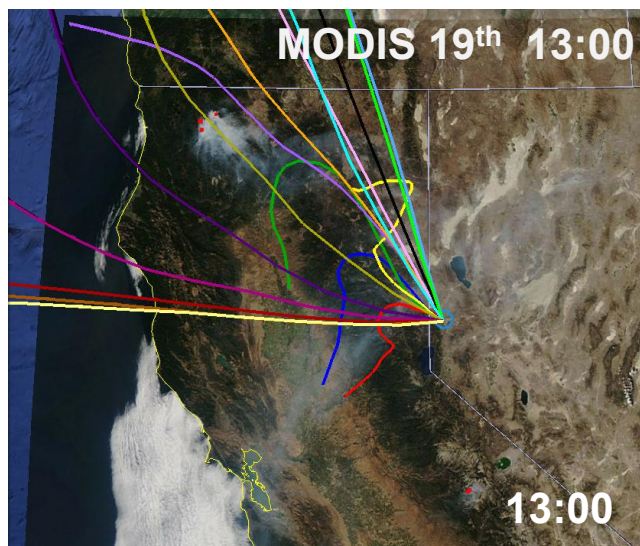
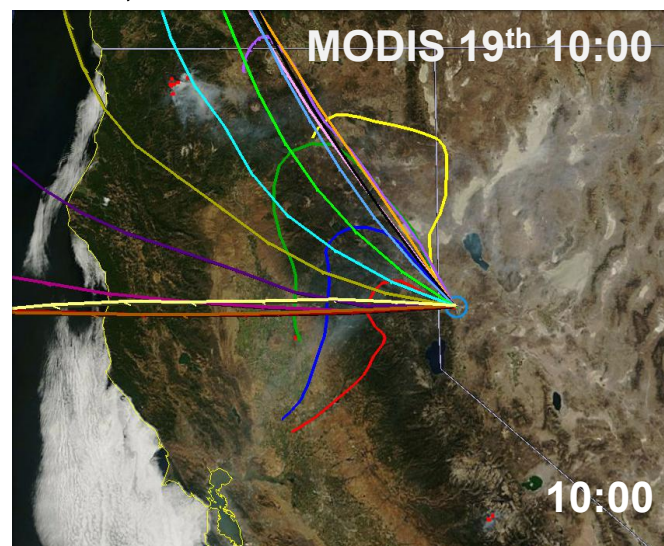
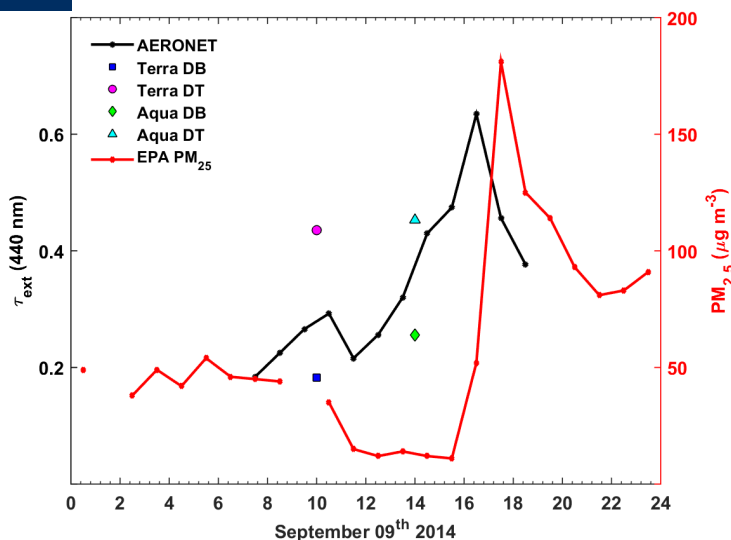




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# HYSPLIT Back Trajectories: 9 Sep 2014

Reno 24 hour, NAM 12-km







# Conclusions

## Summary

- *AOD* satellite retrievals have high uncertainty in the western U.S. due to complex terrain, bright surface, heterogeneous aerosol profiles
- Aerosols above the CBL, enhanced by smoke plume injection above CBL
- Wildfire smoke improves the correlation between AERONET & MODIS but does not improve the bias
- Surface  $PM_{2.5}$  is not linearly correlated with columnar *AOD*

## Future Directions

- Data fusion of MODIS *AOD* and  $PM_{2.5}$  observations, with and without calibration using AERONET to estimate surface  $PM_{2.5}$  [AGU]
- Statistically quantify uncertainties in MODIS *AOD* using AERONET data, and attribute to parameterizations in retrieval algorithm [AGU]
- Use spatial surface  $PM_{2.5}$  concentrations to estimate wildfire smoke exposure in California and Nevada