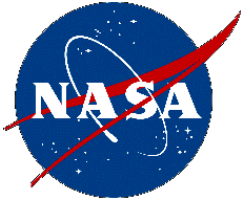


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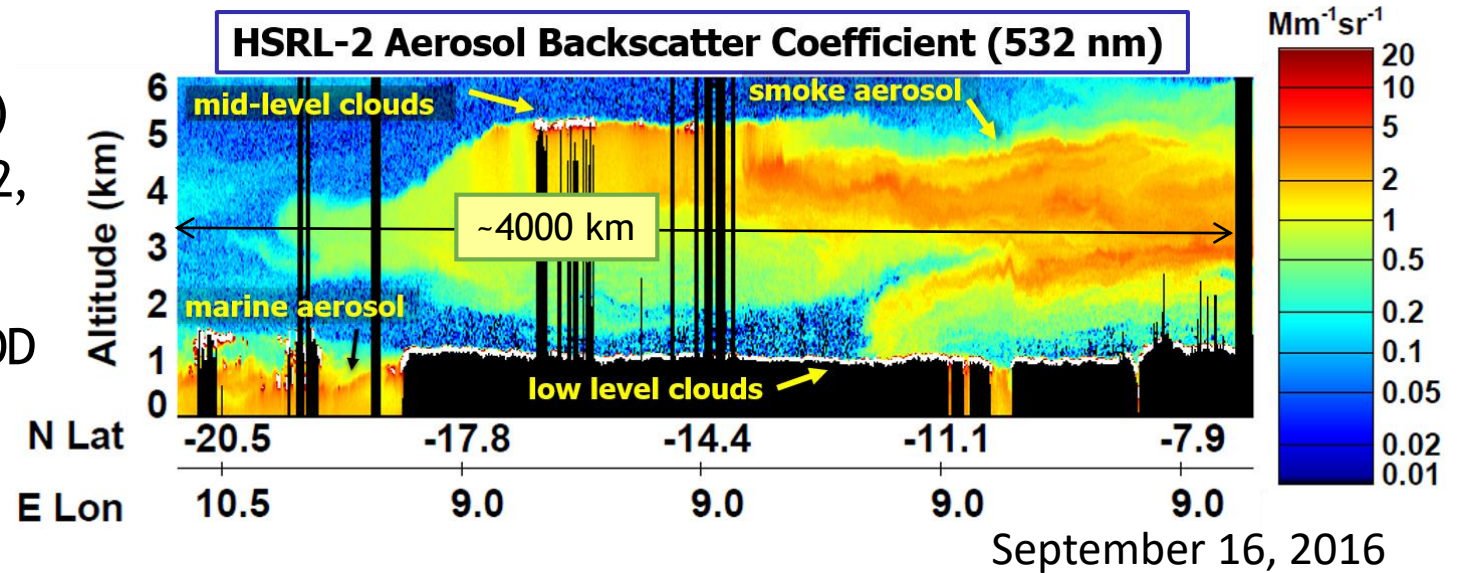
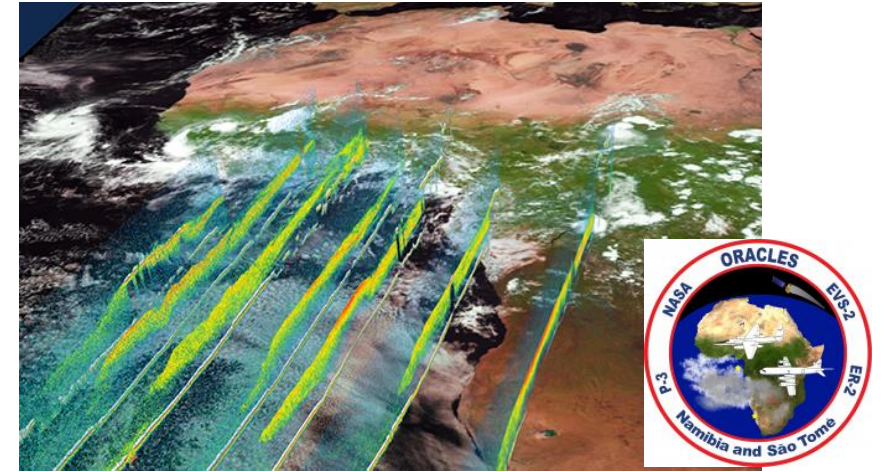
# High spectral resolution lidar for aerosol characterization and combined lidar+polarimeter retrieval

Sharon P. Burton, Snorre Stamnes, Xu Liu, Kyle Dawson, Eduard  
Chemyakin, Richard Ferrare, Chris Hostetler  
*NASA Langley Research Center, HSRL team*

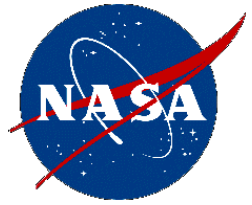
# NASA Langley HSRL-2



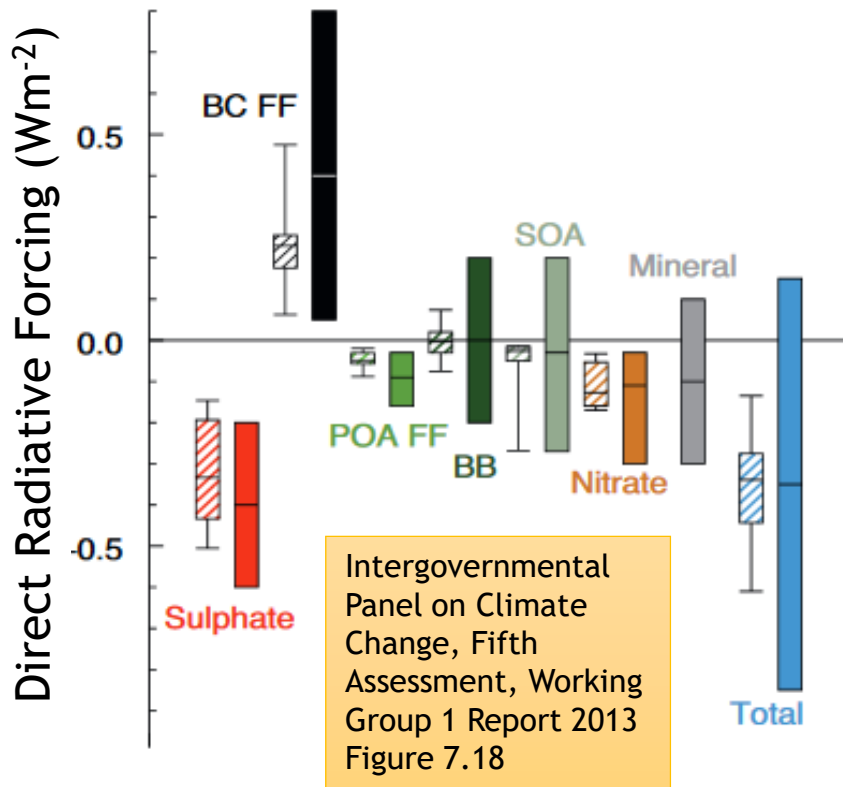
- ACE Decadal Survey satellite prototype
- Nine field missions so far including ORACLES 1,2,3 and CAMP2EX
- Provides satellite calibration and validation
- Provides input to and validation for models
- 3 backscatter wavelengths (355, 532, 1064 nm)
- 2 extinction wavelengths (355, 532 nm)
- 3 depolarization wavelengths (355, 532, 1064 nm)
- Additional products
  - Aerosol optical depth/above cloud AOD
  - Boundary Layer height
  - Qualitative aerosol classification
  - Microphysics retrievals of effective radius, total concentrations (N,S,V)



# What do we need to know about aerosol?



Amount, size, morphology, composition,



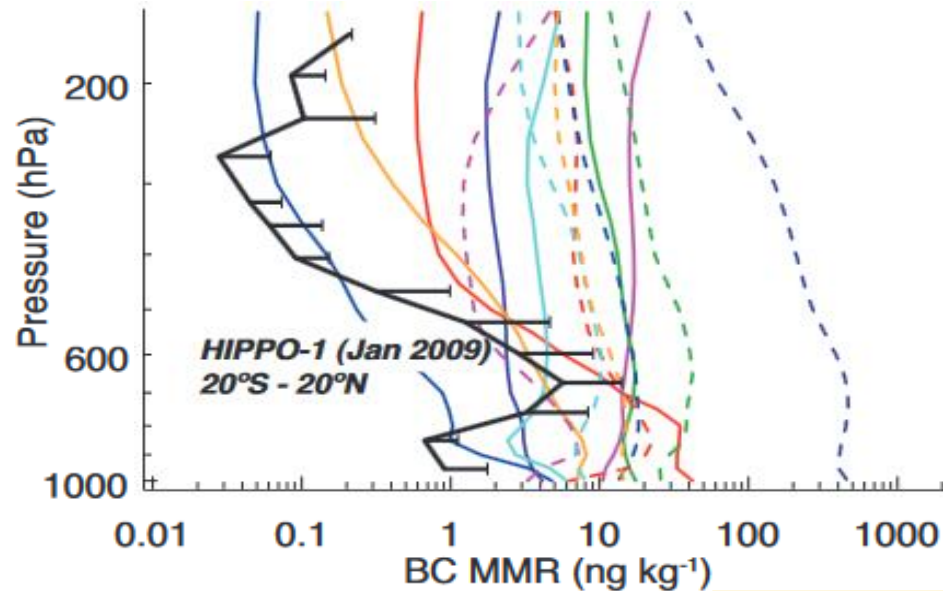
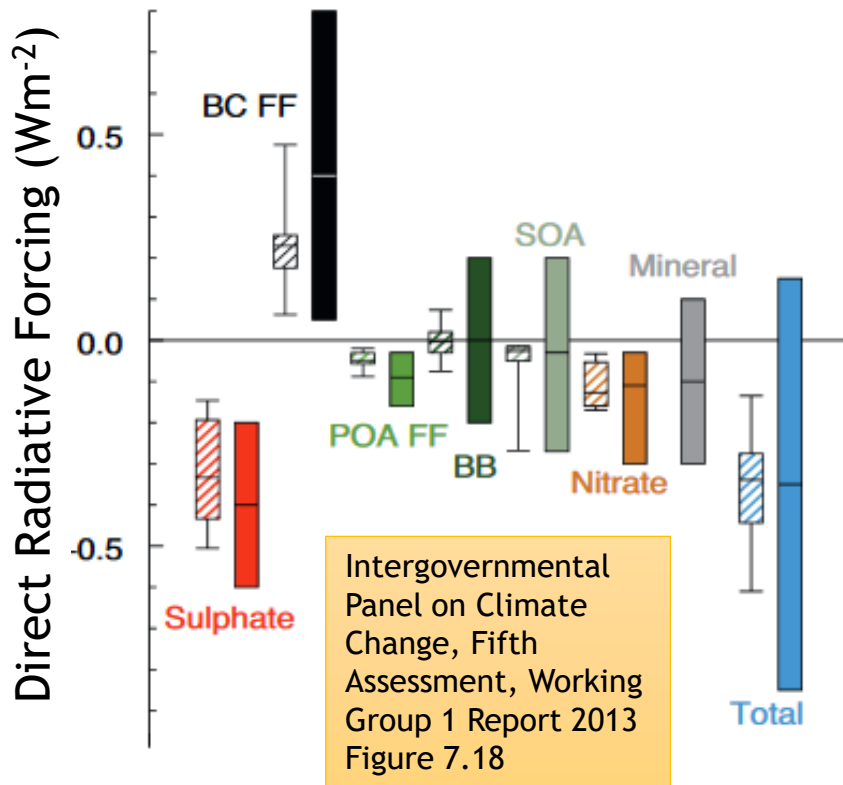
Aerosol is a generic category for many different components

- Aerosols may warm or cool depending on type
- Aerosol-cloud interaction depends on type
- Aerosol transport and lifetime depends on type
- Effects on air quality and health depend on type

# What do we need to know about aerosol?



Amount, size, morphology, composition, and location, location, location



Large diversity in current models' ability to reproduce vertical profile shape

Aerosol is a generic category for many different components

- Aerosols may warm or cool depending on type *and altitude*
- Aerosol-cloud interaction depends on type *and altitude*
- Aerosol transport and lifetime depends on type *and altitude*
- Effects on air quality and health depend on type *and altitude*

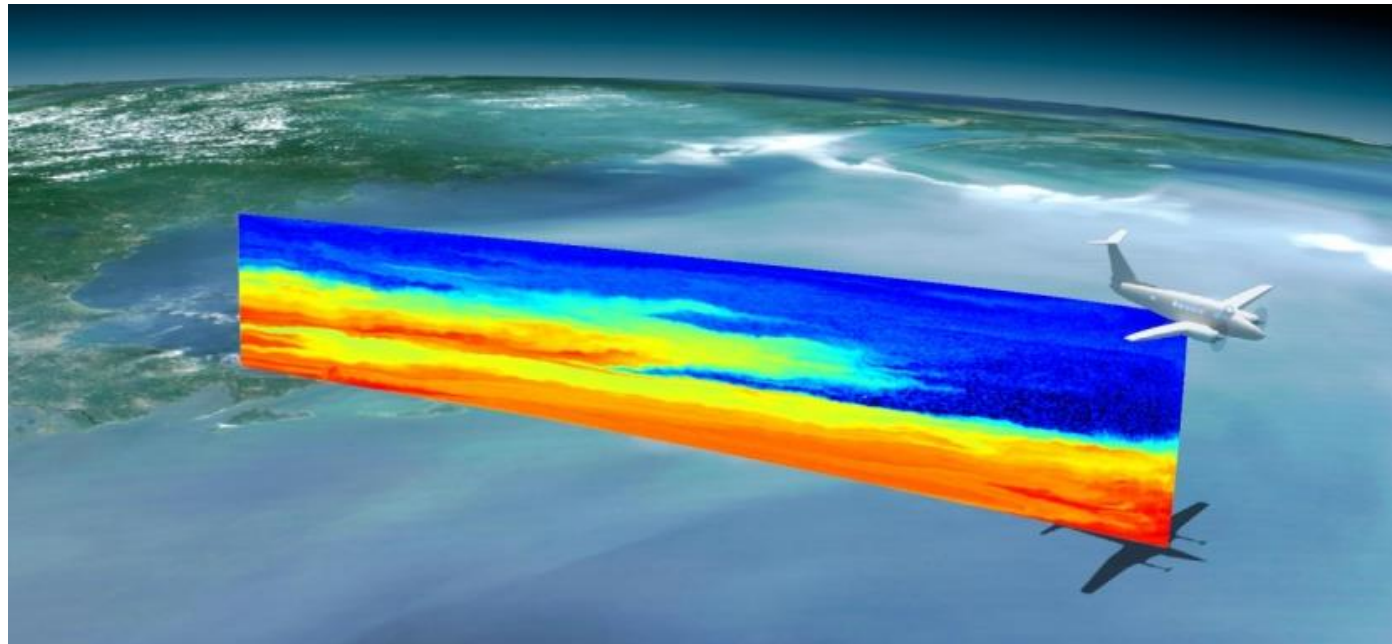


# Why lidar?



Compared to passive aerosol sensors, lidar ...

- provides high resolution vertical profiles
- provides indicators of size, shape, composition
- works at night
- works equally well over bright surfaces
- works between broken clouds and near clouds



# Combined lidar + polarimeter retrieval



## Lidar

- vertically resolved measurements
- multi-wavelength backscatter and extinction coefficients
- good accuracy for size distribution
- less accuracy for absorption

## Polarimeter

- multiwavelength, multiangle
- polarized radiances
- good sensitivity to absorption
- limited information on vertical profile

## Lidar + Polarimeter

- vertically resolved profiles of size distribution, concentrations, and absorption

The combination of lidar + polarimeter measurements optimizes the information about the vertical profile of absorption properties

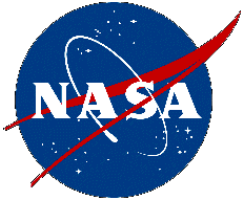
# Role of combined retrieval in ACCP

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- Retrieval of ACCP geophysical variables
  - SATM includes *layer resolved* aerosol size distribution and absorption
  - Requires *combined retrieval* of polarimeter (sensitive to absorption) and lidar (vertically resolved)
- Assessment of measurement capabilities
  - Our retrieval architecture is *adaptable* to other instruments
  - *Information content analysis* allow quantitative assessment of ACCP candidate configurations
  - HSRL2 + RSP *field campaign data* allows us to compare performance against down-selected data (simulating less capable architectures)

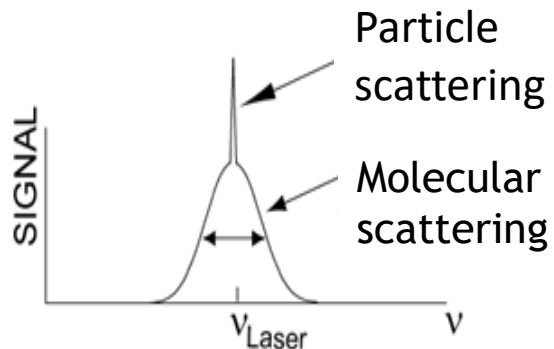
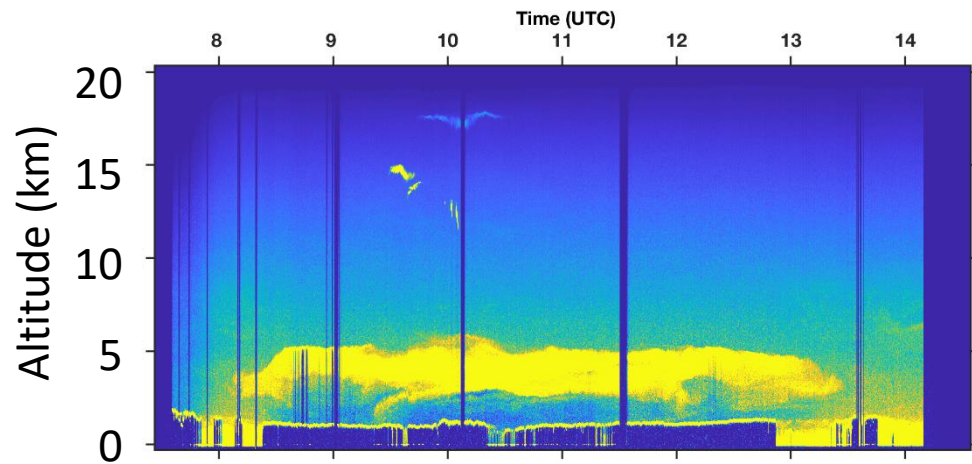
# High Spectral Resolution Lidar = independent measures of extinction and backscatter



2 unknowns

$\beta \Rightarrow$  backscatter,  $\alpha \Rightarrow$  extinction

$$P_a(r)r^2 = [\beta_m(r) + \beta_a(r)] \exp \left\{ -2 \int_0^r [\alpha_m(r') + \alpha_a(r')] dr' \right\}$$





# High Spectral Resolution Lidar = independent measures of extinction and backscatter



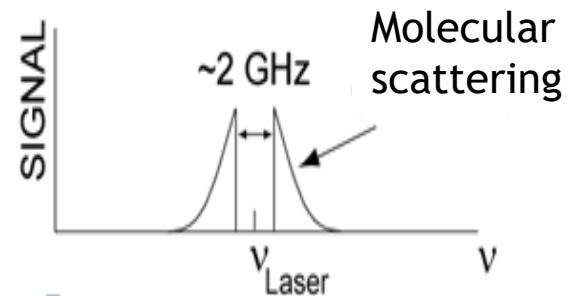
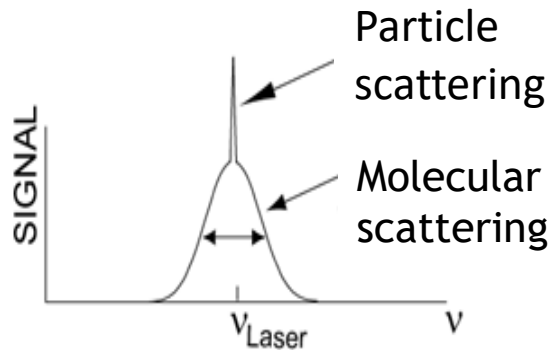
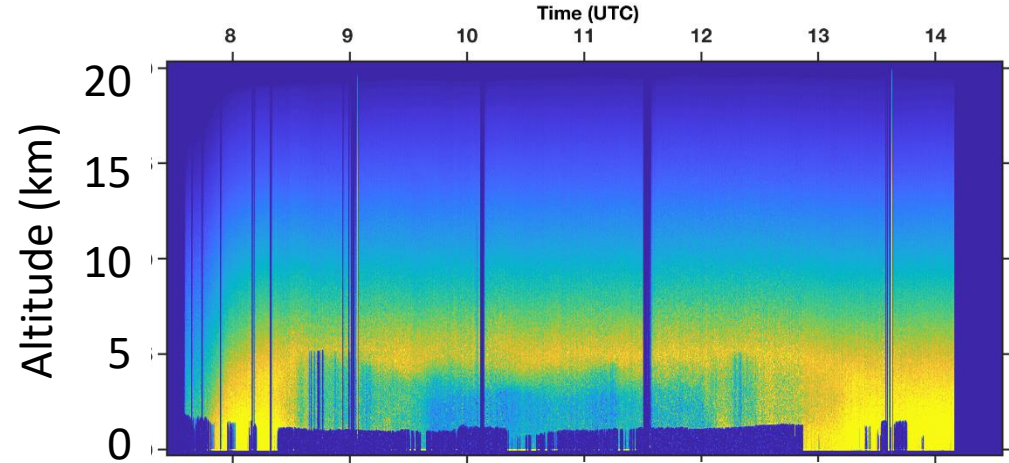
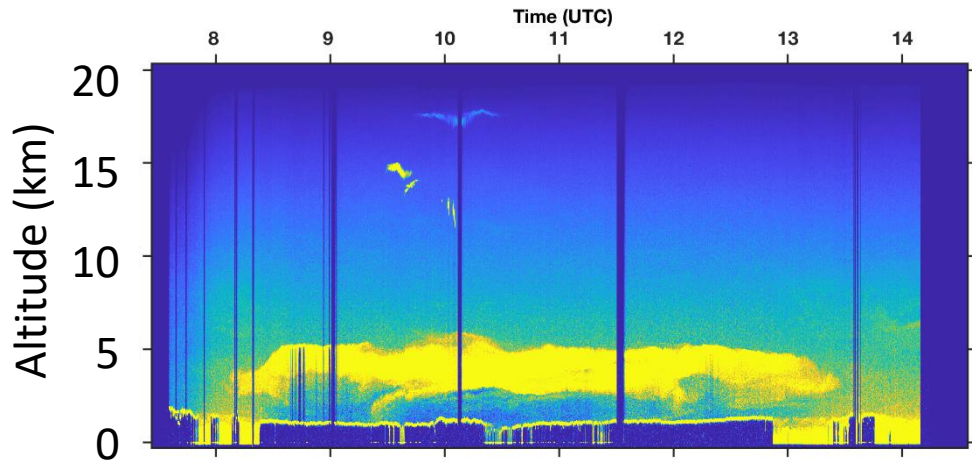
2 unknowns

$\beta \Rightarrow$  backscatter,  $\alpha \Rightarrow$  extinction

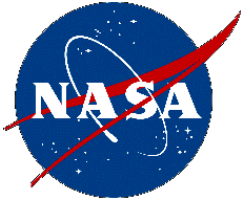
2 equations

$$P_a(r)r^2 = [\beta_m(r) + \beta_a(r)] \exp \left\{ -2 \int_0^r [\alpha_m(r') + \alpha_a(r')] dr' \right\}$$

$$P_m(r)r^2 = [\beta_m(r)] \exp \left\{ -2 \int_0^r [\alpha_m(r') + \alpha_a(r')] dr' \right\}$$



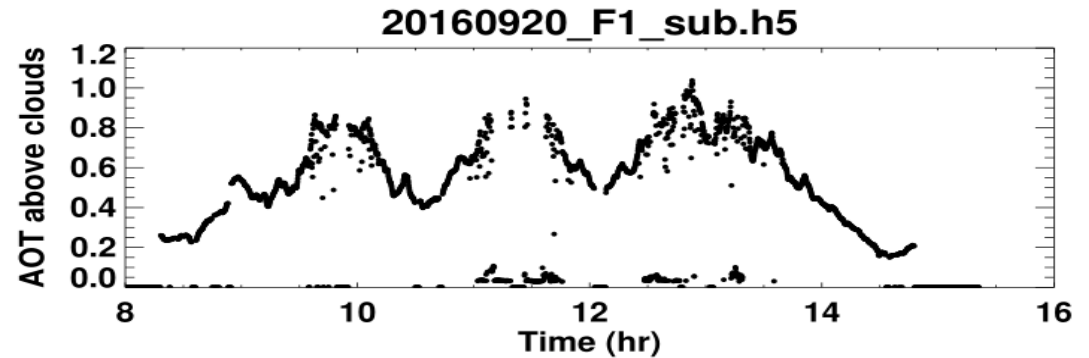
# Aerosol extinction



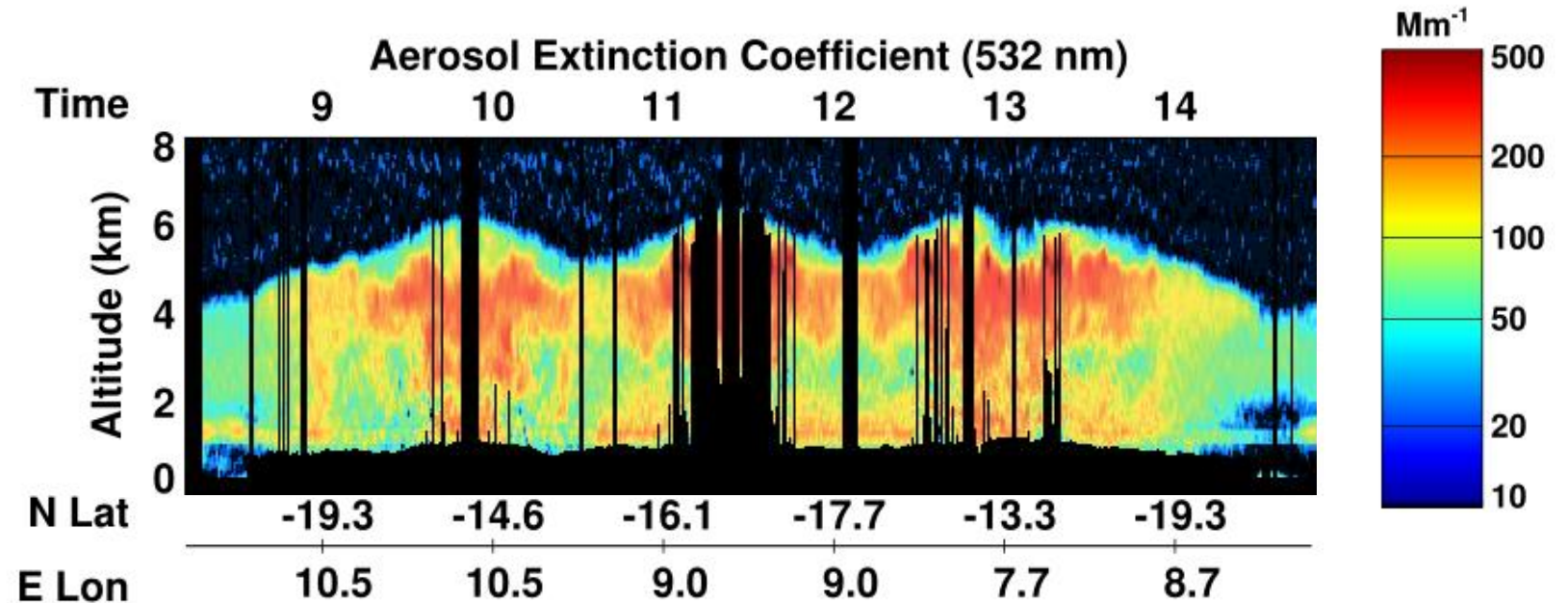
HSRL “molecular” channel  
or “attenuation” channel:

$$P_m(r)r^2 = [\beta_m(r)] \exp \left\{ -2 \int_0^r [\alpha_m(r') + \alpha_a(r')] dr' \right\}$$

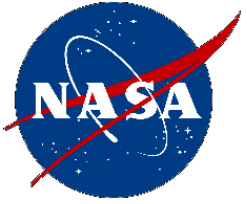
1 unknown



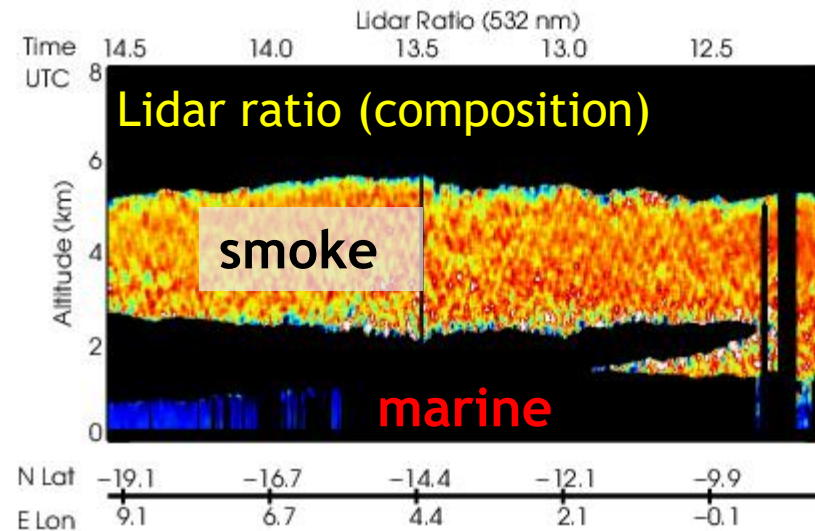
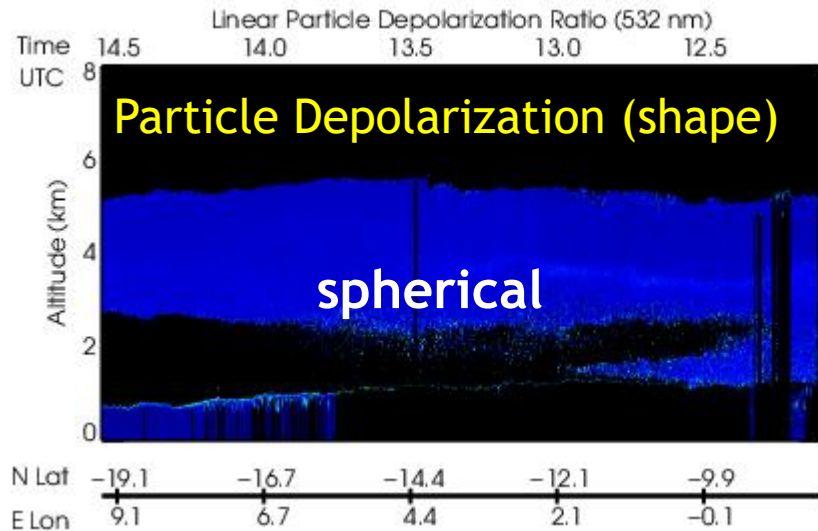
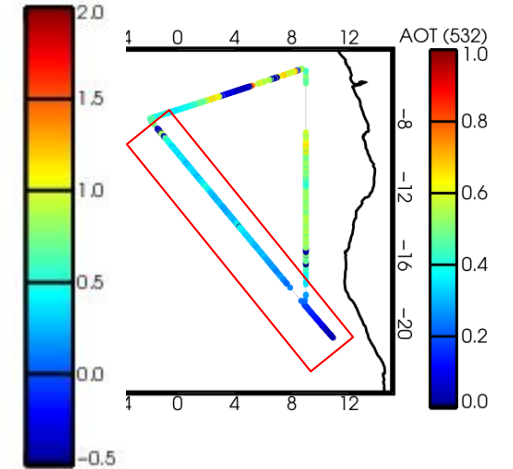
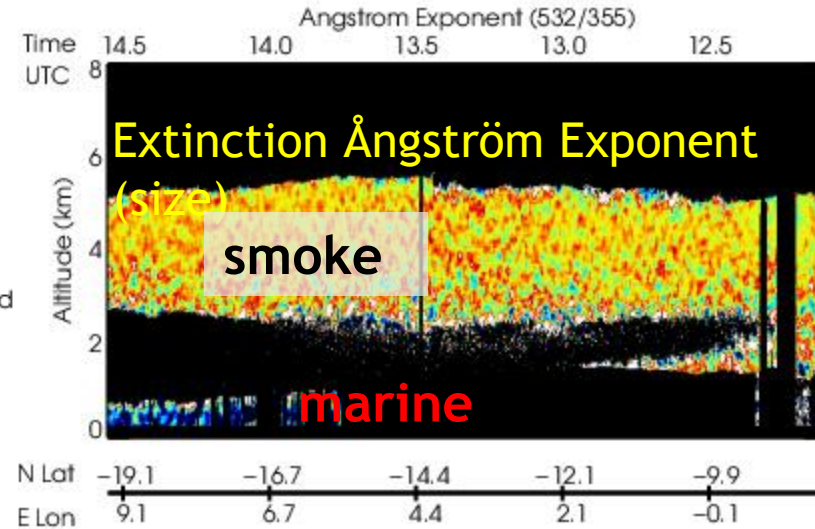
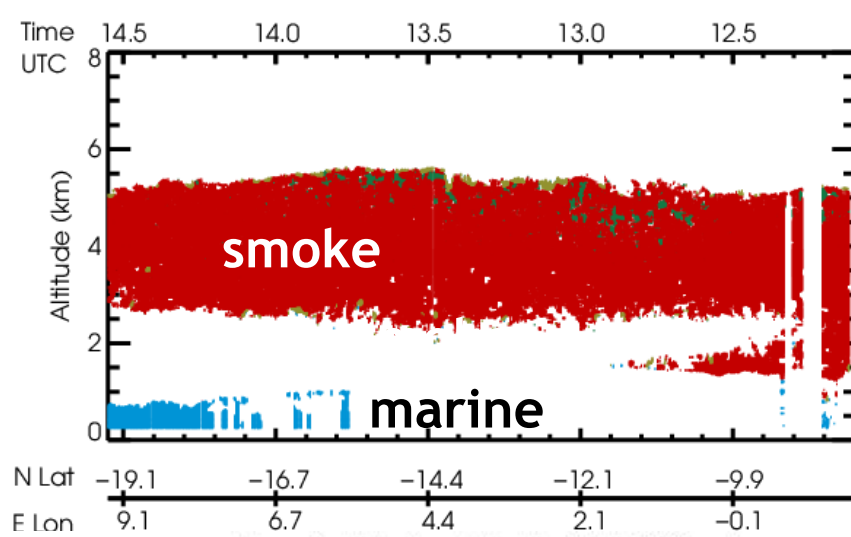
- The filtered channel provides direct measure of AOT and extinction
- Extinction measurement does not require modeled lidar ratio or constraint
- Little loss of accuracy from attenuation
- No need for layer detection



# Aerosol intensive parameters: size, shape, and composition



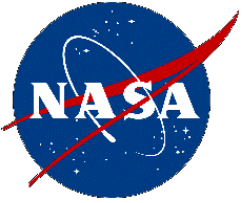
ORACLES September 12, 2016



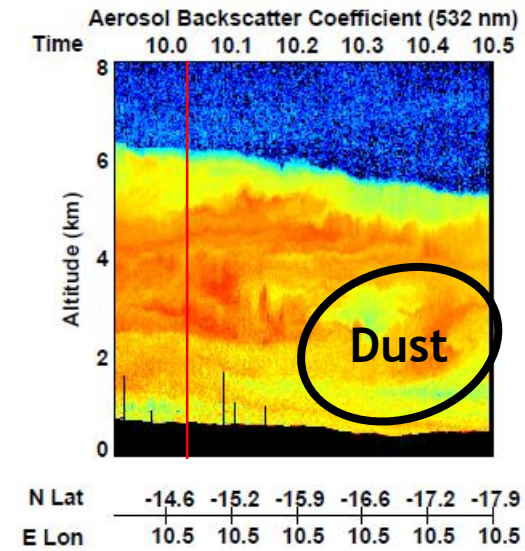
See also: Burton et al. 2012 AMT *Aerosol Classification of Airborne High Spectral Resolution Lidar Measurements - Methodology and Examples*



# Aerosol intensive parameters, part 2

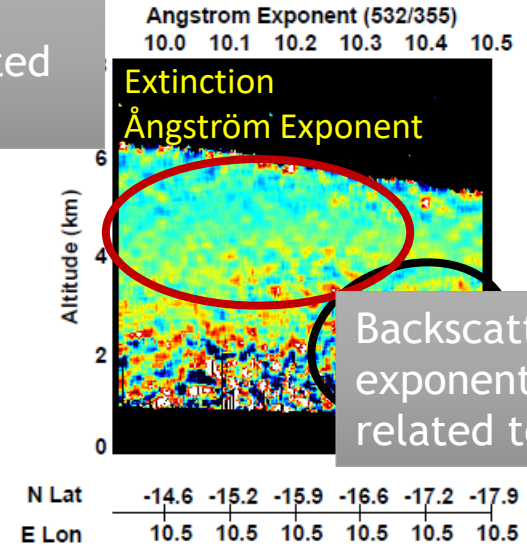
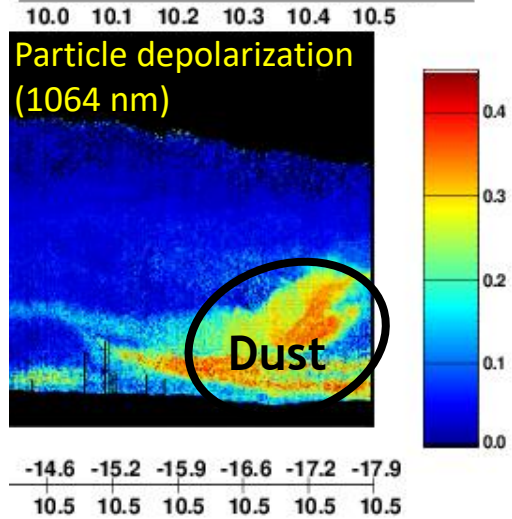
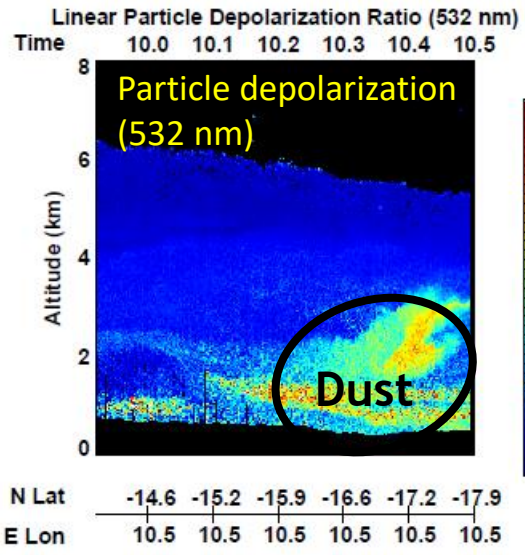


ORACLES September 20, 2016

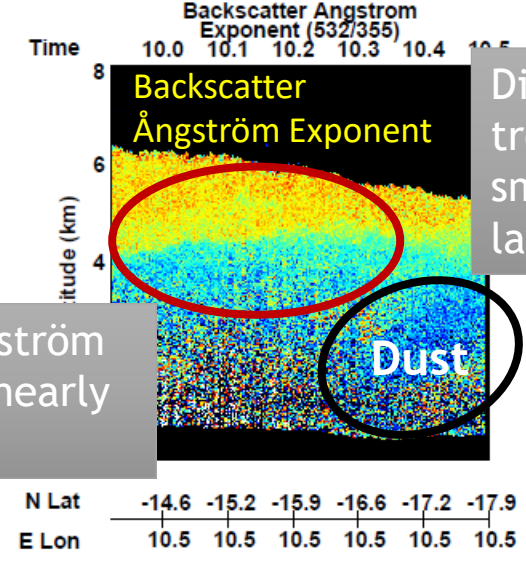


Extinction Ångström exponent closely related to particle size

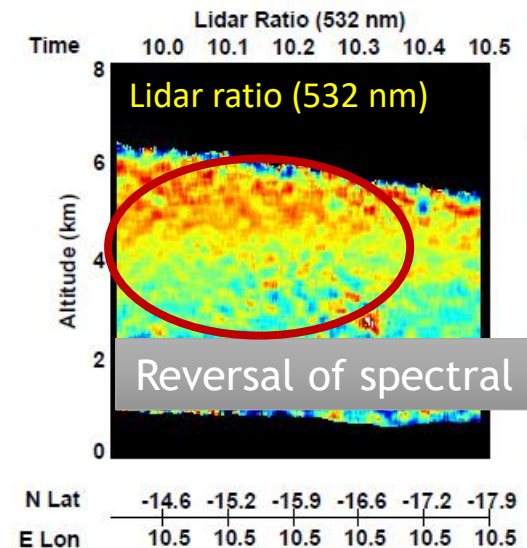
Equal or higher values of particle depolarization at 1064 nm compared to 532 nm indicate the non-spherical particles are large



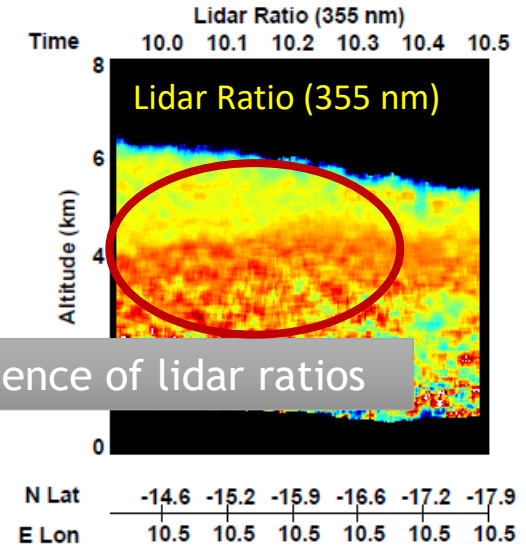
Backscatter Ångström exponent non-linearly related to size



Different trend in smoke layers



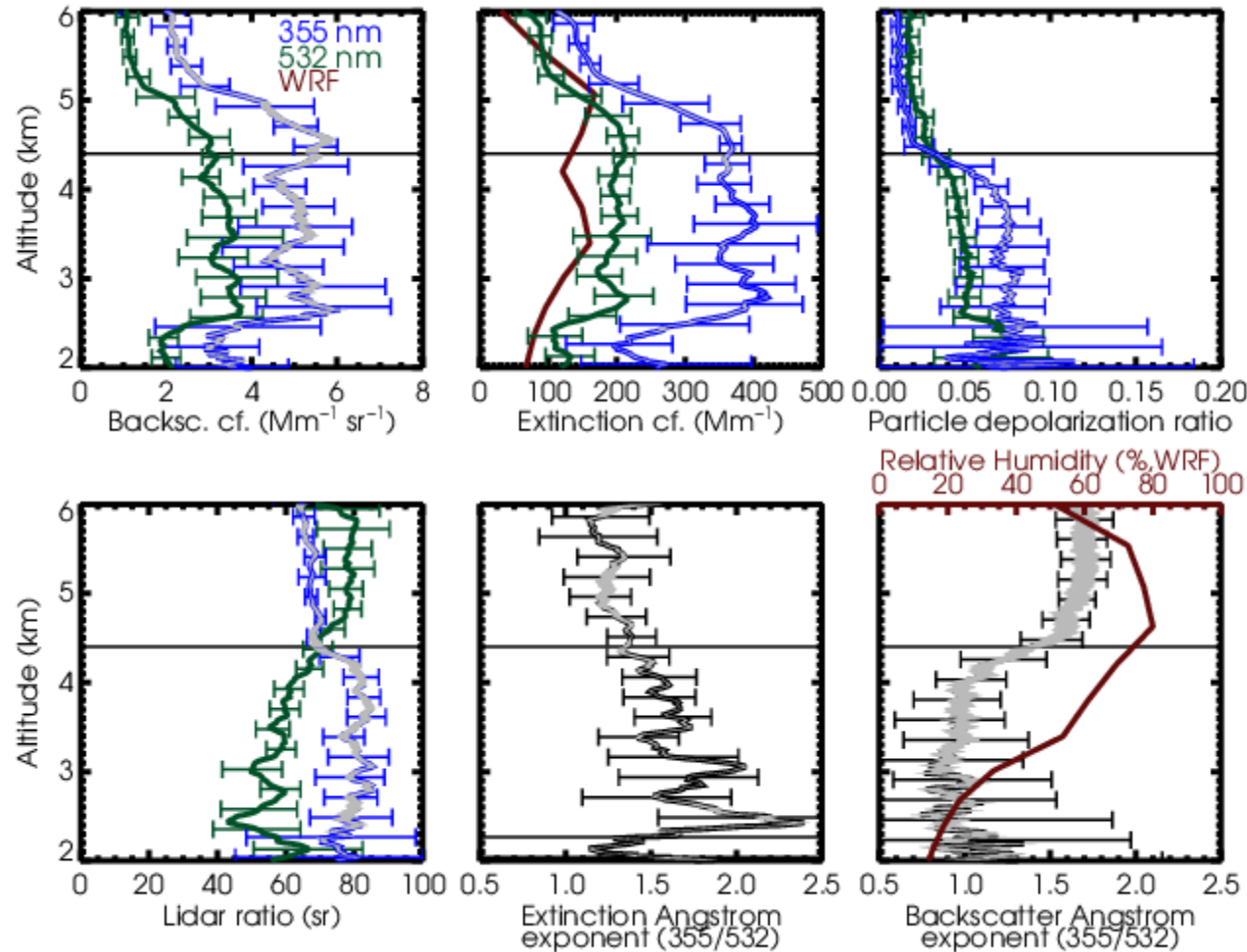
Reversal of spectral dependence of lidar ratios



# Vertical variability on September 20, 2016



ORACLES 2016 September 20 9:54-10:06 UT



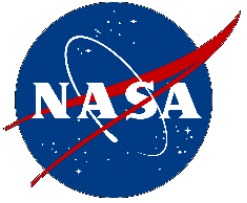
## Below vs. above 4.4 km:

- Some smoke depolarization
- Lidar ratio spectral ratio reverses
- Extinction Ångström exponent increases, suggesting smaller particles
- Backscatter Ångström exponent decreases
- Less relative humidity

Burton et al. 2018, Calibration of a high spectral resolution lidar using a Michelson interferometer, with data examples from ORACLES, *Applied Optics*, 2018



# Is it “young” smoke?



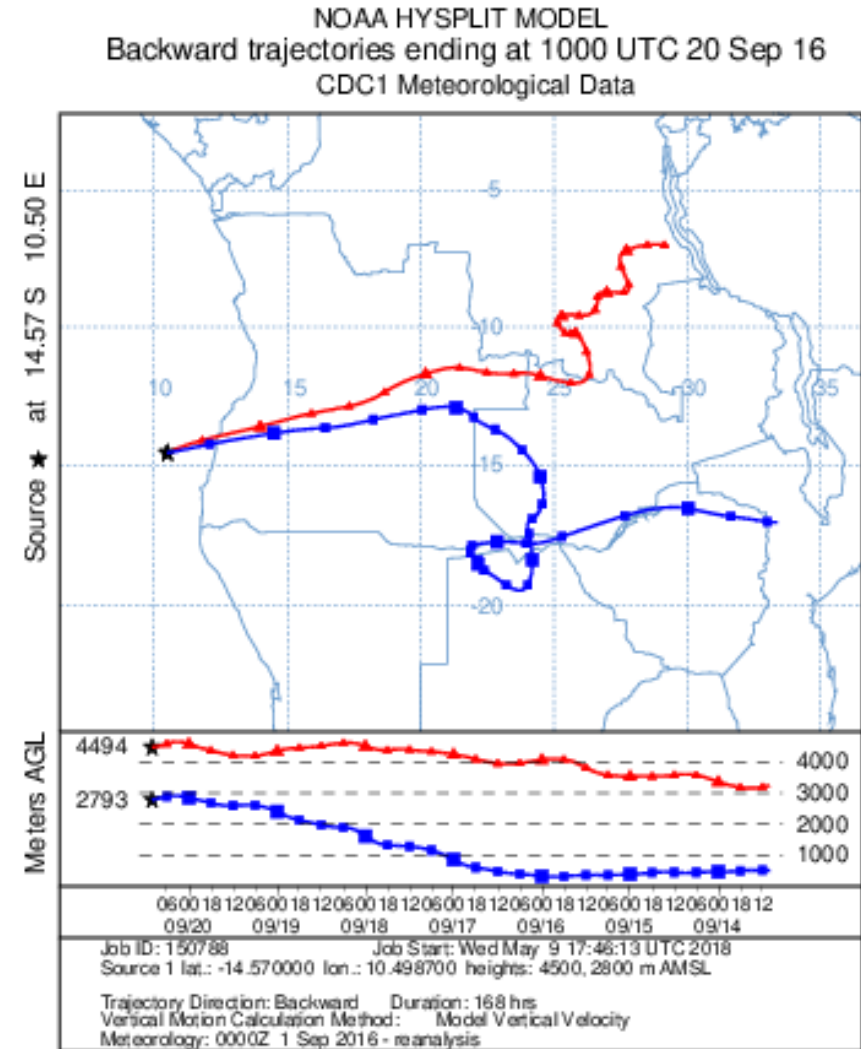
Nicolae et al. 2013 suggests that 355 nm lidar ratio > 532 nm lidar ratio only for fresh smoke (< 1 day).

## Characterization of fresh and aged biomass burning events using multiwavelength Raman lidar and mass spectrometry

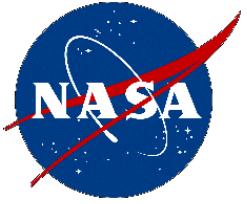
D. Nicolae,<sup>1</sup> A. Nemuc,<sup>1</sup> D. Müller,<sup>2,3,4,5</sup> C. Talianu,<sup>1</sup> J. Vasilescu,<sup>1</sup> L. Belegante,<sup>1</sup> and A. Kolgotin<sup>6</sup>

agree with similar studies carried out in different regions on the globe. Our study shows that the Ångström exponent  $LR_{532}/LR_{355}$  and the imaginary part of the refractive index can be used to clearly distinguish between fresh and aged smoke particles.

However: back-trajectories show that neither layer is younger than approximately 4 days. This is in agreement with ORACLES WRF-Chem airmass age modeling (Pablo Saide)

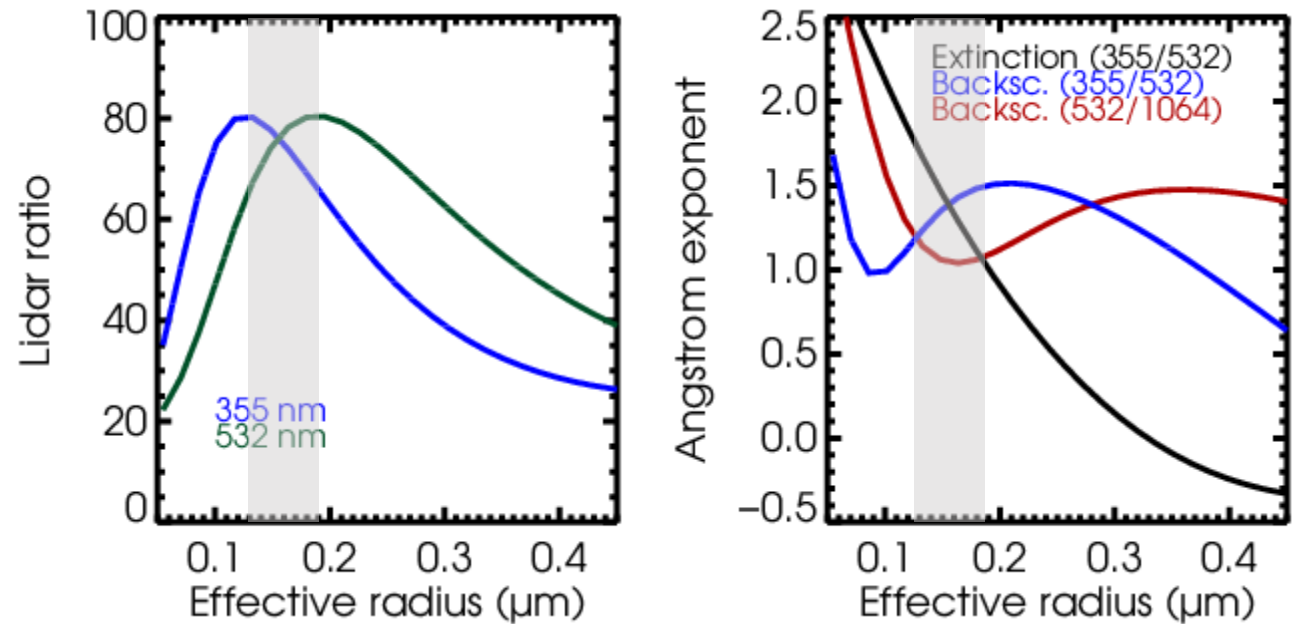


# Optical properties from Mie modeling



- Monomodal log-normal distribution of spherical particles (simple case).
- Effective radius is varied.
- All other variables fixed: effective variance = 0.195, CRI = 1.49-i0.01325 (wavelength independent)

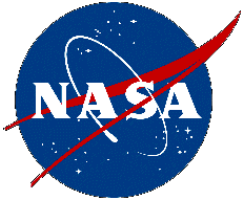
- As effective radius increases, and *nothing else changes*,
  - Extinction Ångström exponent decreases
  - Spectral ratio of lidar ratio reverses



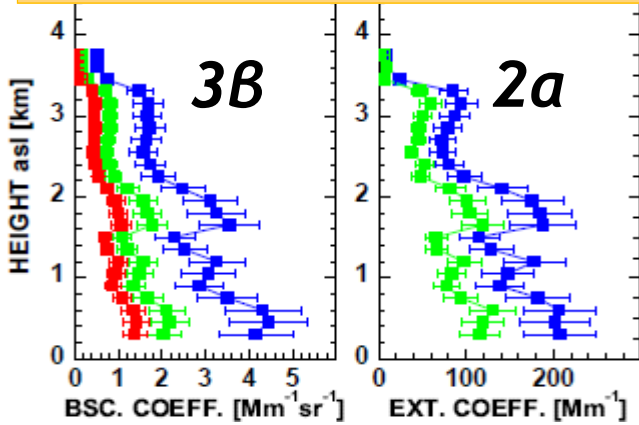
## Conclusion:

- A difference in the particle size alone between the two layers is sufficient to explain the unusual observations.
- Particles with  $S_a(355) > S_a(532)$  are not limited to very young smoke.

# Lidar aerosol microphysical retrievals



Multiwavelength lidar retrieval algorithms  
(Müller et al, 1999; Veselovskii et al. 2002; etc)



Aerosol Backscatter: **355 nm** + **532 nm** + **1064 nm**  
 Aerosol Extinction: **355 nm** + **532 nm**

lidar measurements

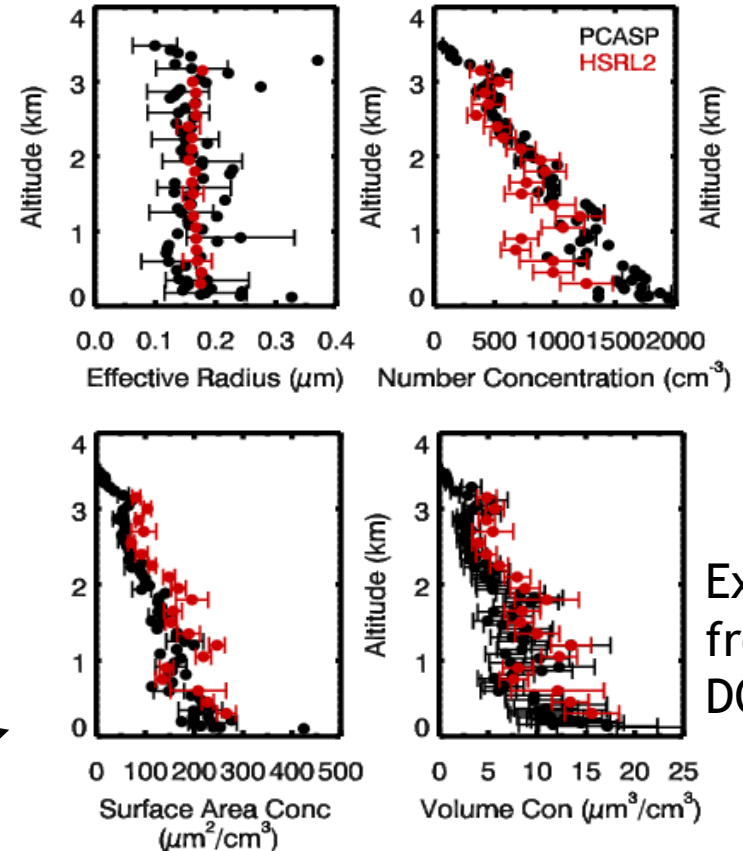
particle size distribution

**INVERSION**

$$\beta(\lambda) = \int K_{\beta}(r, m, \lambda) v(r) dr$$

$$\alpha(\lambda) = \int K_{\alpha}(r, m, \lambda) v(r) dr$$

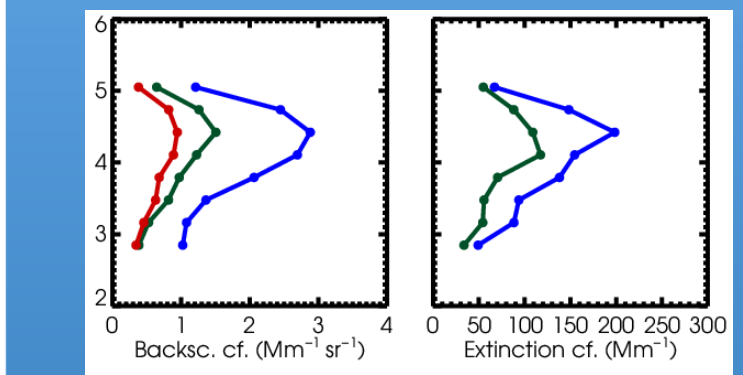
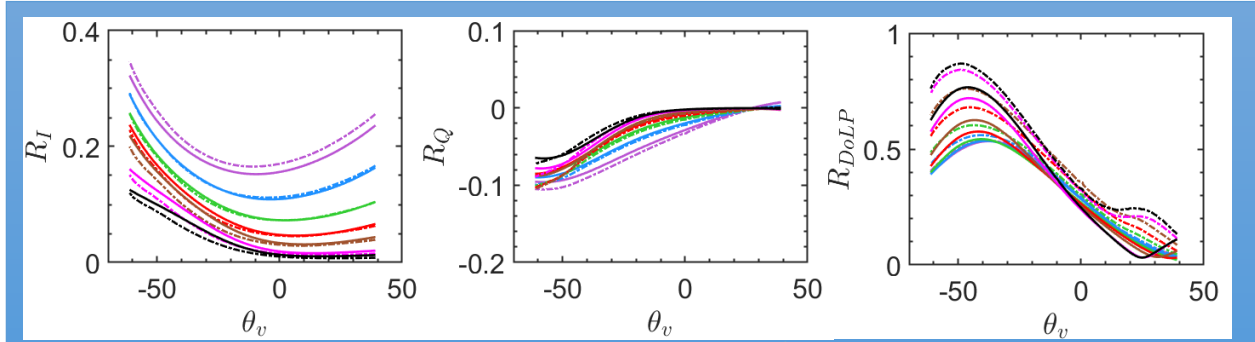
size, refractive index, wavelength



Example from DOE TCAP

- $3\beta+2\alpha$  (i.e. 3 backscatter + 2 extinction) considered the minimum information necessary for microphysical retrievals (Bockmann et al, 2005)
- Lidar microphysical retrievals of effective radius and concentrations validated against in situ for 2012 TCAP mission (Müller et al., 2014, AMT) and 2013 DISCOVER-AQ (Sawamura et al., 2017, AMT)

# Combined lidar + polarimeter retrieval



**+ Forward Model**

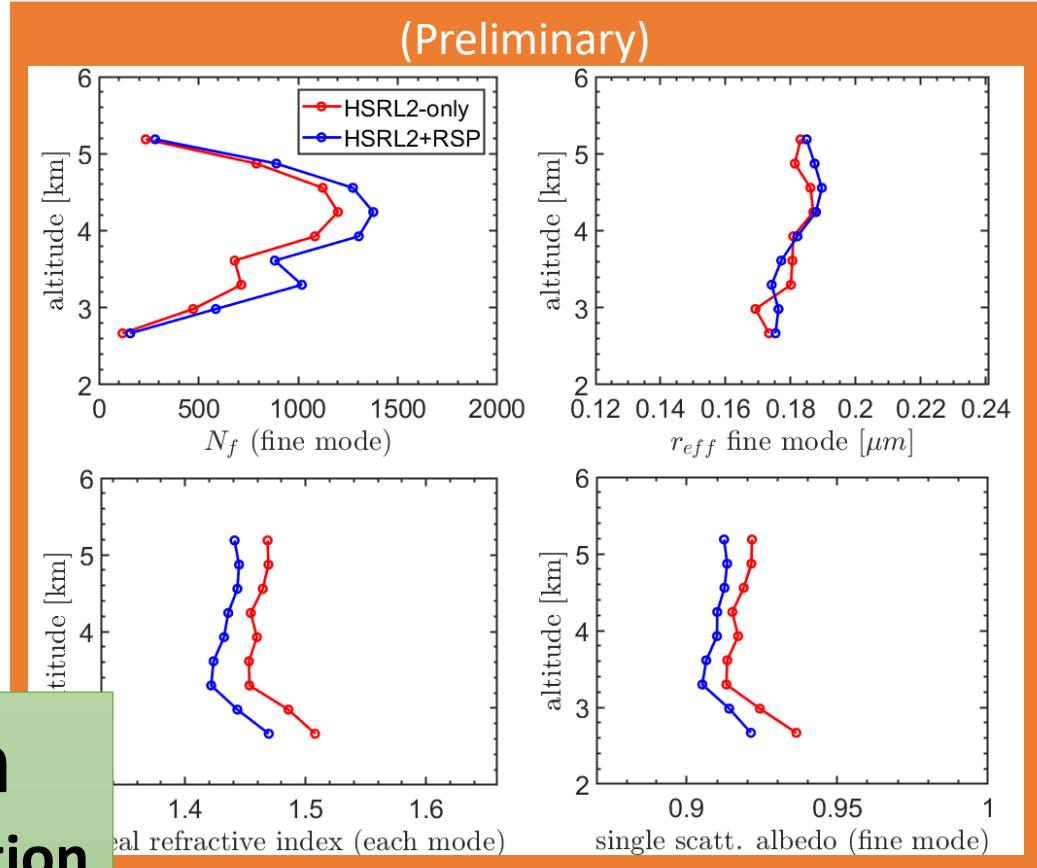
- Mie theory (spherical)
- Vector radiative transfer (Stamnes et al. 2018)
- Layer combination rules

## Input measurements:

- RSP total and polarized radiances (7 wavelengths, 480 angles)
- HSRL2 vertically resolved backscatter and extinction coefficient (355, 532, 1064 nm)
- And their uncertainties

+ a priori (chosen to have weak impact)

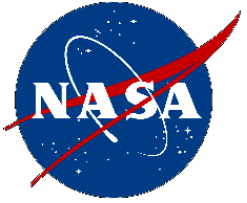
**Inversion**  
**Optimal Estimation**  
 Optimizes result to fit measurements within uncertainty



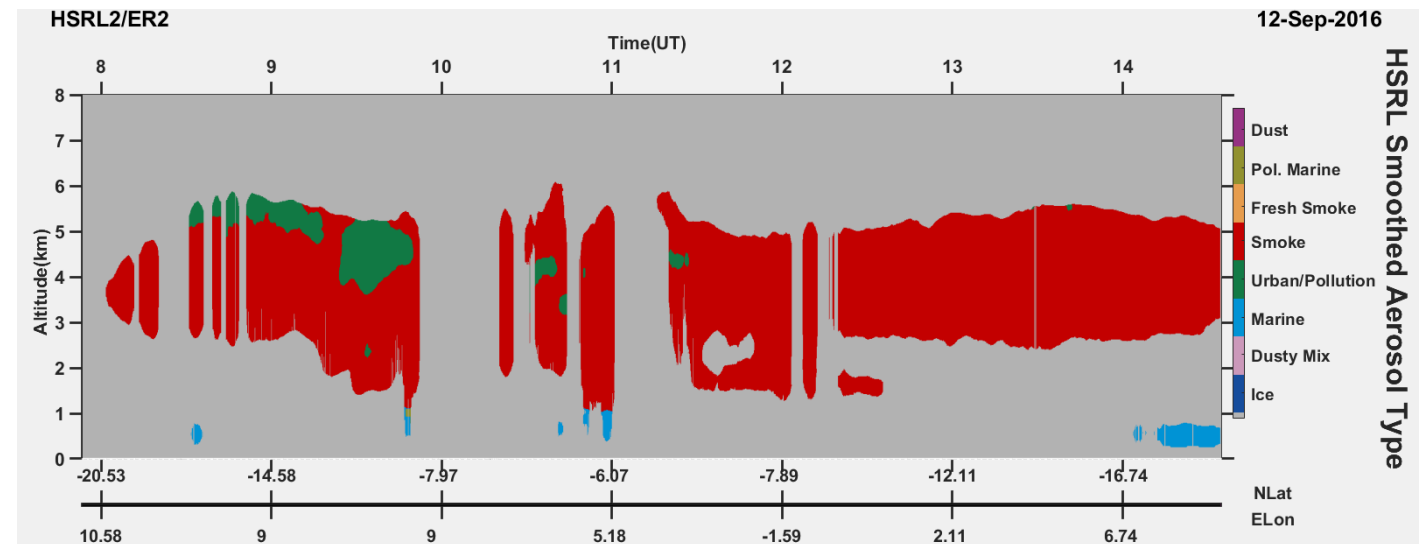
## Output:

Vertically resolved particle concentrations, effective radius, and absorption

# Layer combination rules



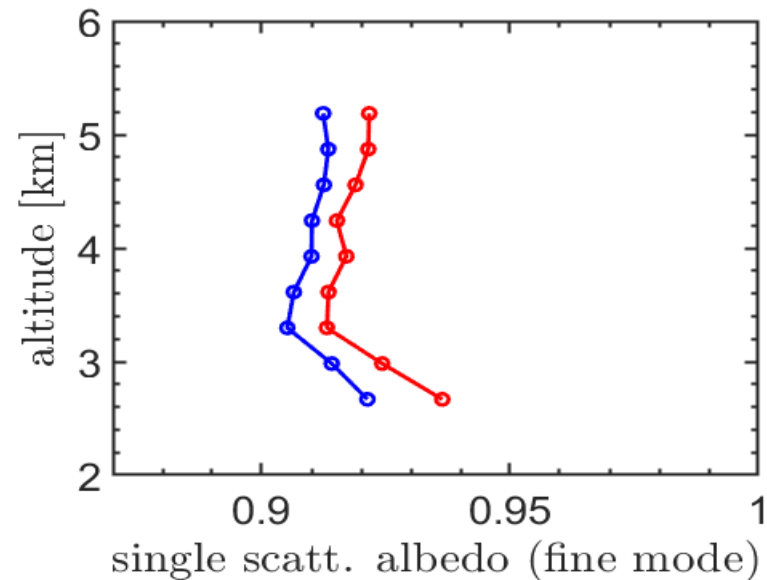
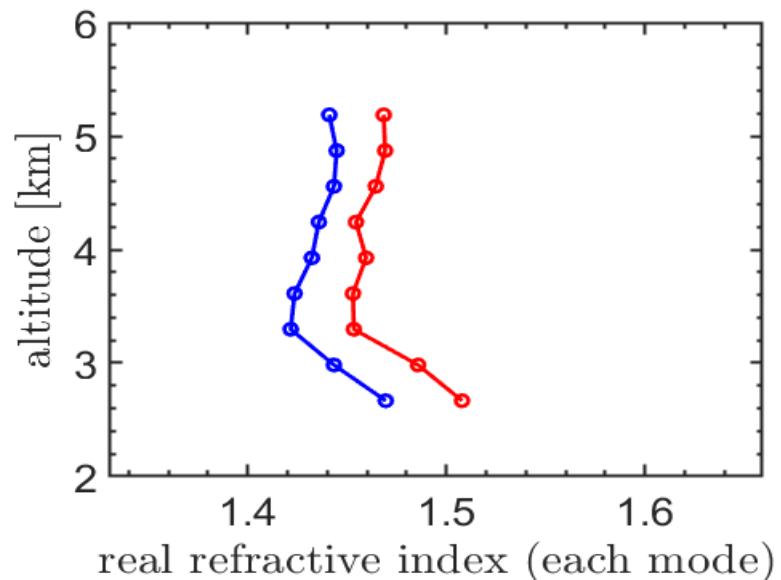
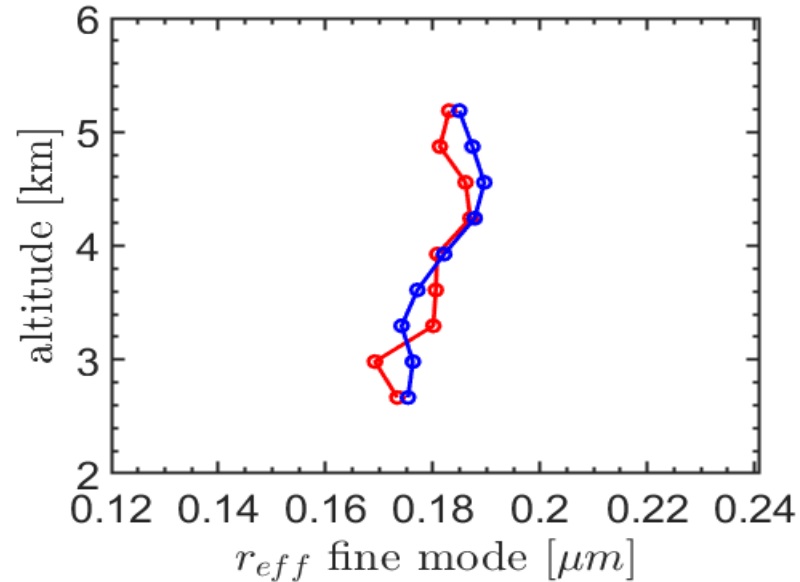
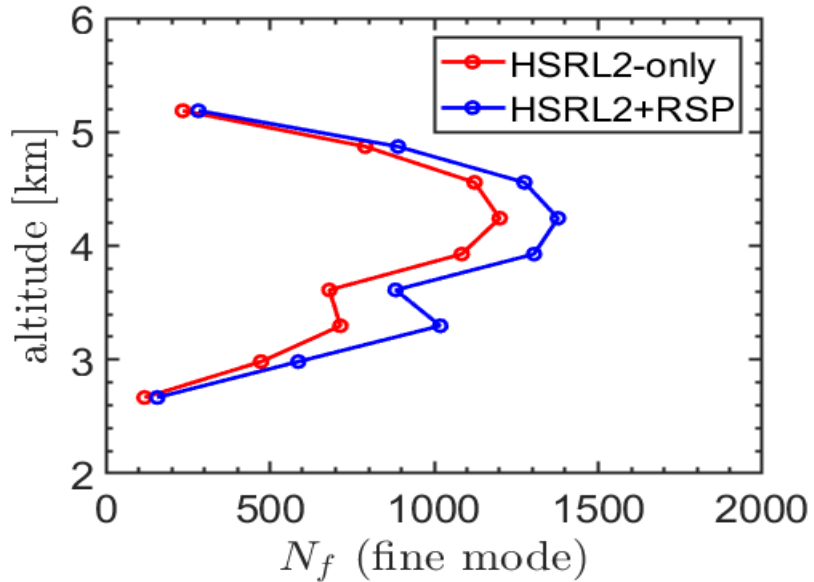
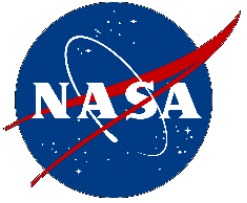
- Lidar = vertically resolved ; polarimeter = column-only
- Retrieval state vector = aerosol state for each lidar level, but retrieving all with the radiative transfer is prohibitive
- Continuous layers with similar properties identified using HSRL aerosol typing
- Effective state variables represented by combining values *within a layer of similar properties*
  - Effective size distribution matches optical measurements by matching 1<sup>st</sup>, 2<sup>nd</sup>, 3<sup>rd</sup> moments
  - Effective complex refractive index is assumed by weighted averaging
- Combined analytic Jacobian describes combination of lidar and polarimeter parts, e.g.



$$\frac{dy^{pol}}{dr_f^{lid}(i)} = \frac{\partial y^{pol}}{\partial r_f^{pol}} \frac{\partial r_f^{pol}}{\partial r_f^{lid}(i)} + \frac{\partial y^{pol}}{\partial \sigma_f^{pol}} \frac{\partial \sigma_f^{pol}}{\partial r_f^{lid}(i)}$$

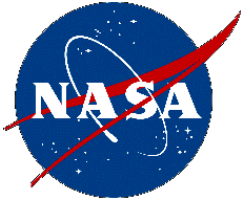


# Combined lidar + polarimeter retrieval



Preliminary result  
12 September 2016  
ORACLES

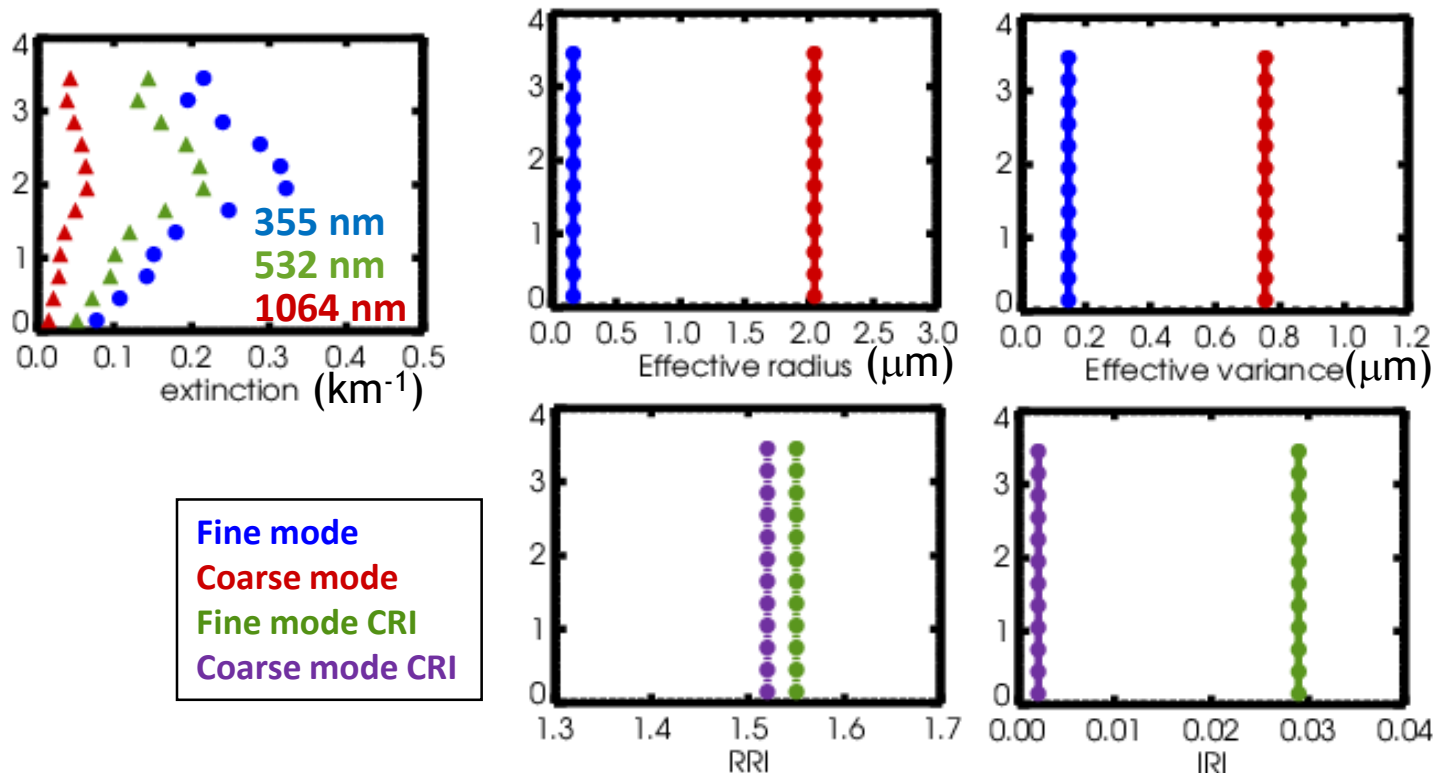
# Information content study



Propagated uncertainties (Rodgers 2000)

$$\hat{\mathbf{S}} = (\mathbf{J}^T \mathbf{S}_\varepsilon^{-1} \mathbf{J} + \mathbf{S}_a^{-1})^{-1}$$

- $\mathbf{J}$  = Jacobian matrix = partial derivatives of measurements with respect to state = linearized forward model
- $\mathbf{S}_\varepsilon$  = measurement error covariance matrix
- $\mathbf{S}_a$  = a priori covariance matrix

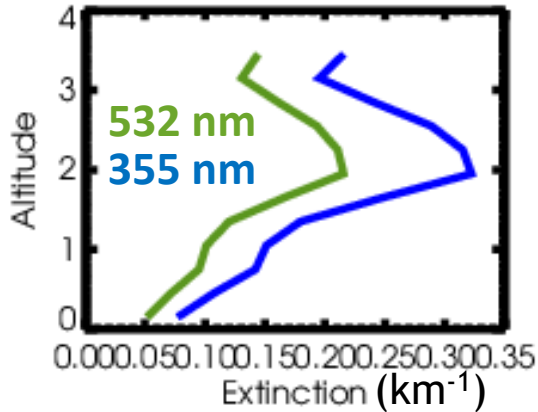
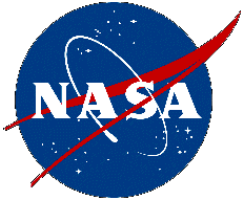


## Inputs:

- Aerosol profiles of microphysics
  - for cases or “slices” of state space
  - here, simulated smoke
- Forward model
  - Mie theory (spherical particles), radiative transfer (Stamnes 2018)
- Measurement errors
- A priori uncertainties
  - Here: the full possible range taken by the microphysics variables (intended to have little impact)
  - However, the method also can accommodate using situational a priori from a climate model or aerosol typing

Burton, S. P., et al.: Information content and sensitivity of the  $3\beta + 2\alpha$  lidar measurement system for aerosol microphysical retrievals, AMT, 2016.

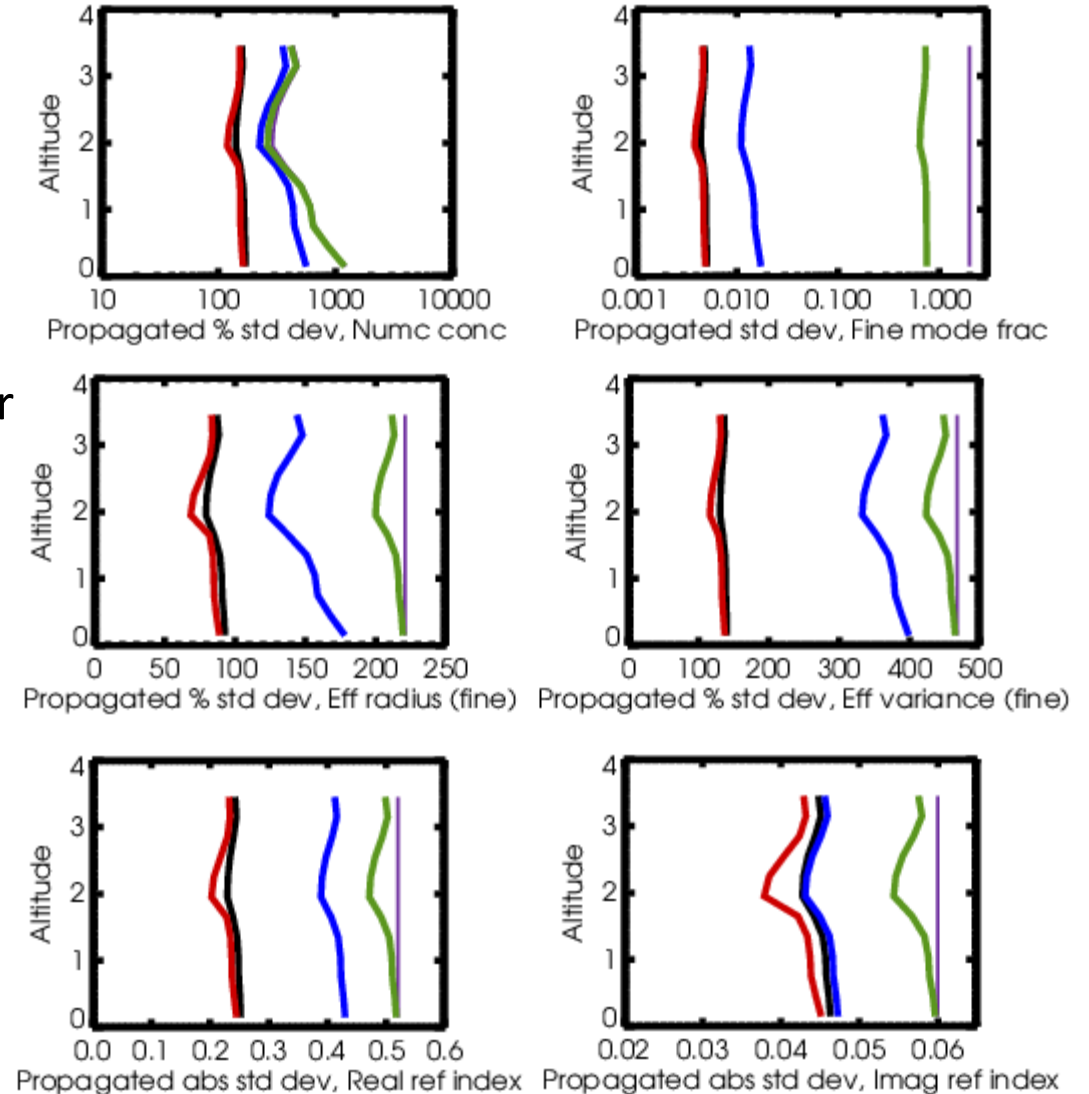
# Reduction of uncertainties by combined measurements



12 levels of simulated smoke

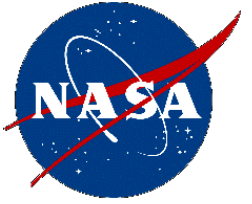
- Contribution of measurements to the reduction of error
- Propagated errors for lidar+polarimeter < lidar only < polarimeter < prior
- Quantitative results vary with aerosol microphysical state and assumed input errors
- Results for polarimeter depend on the number of levels used to represent the state

**Prior**  
**Polarimeter contribution**  
 **$3\beta+2\alpha$  lidar contribution**  
 **$3\beta+2\alpha$  lidar + polarimeter**  
 **$2\beta+1\alpha$  lidar + polarimeter**



# Summary

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- High Spectral Resolution Lidar provides useful information about vertically resolved aerosol microphysical properties in the atmosphere that are not otherwise available
- HSRL measurements reflect sensitivity to vertically resolved amount, size, shape, and composition of aerosol
- The combination of lidar with polarimeter takes advantage of complementary information for a more complete vertically resolved aerosol microphysical retrieval
- A lidar + polarimeter combined retrieval algorithm is being developed at NASA Langley
- Information content analysis provides complementary understanding of the combined measurement sensitivity and retrieval capabilities
- Both the combined retrieval tool and the information content analysis tools are being used in ACCP analysis of instrument configurations