

Improvement of MODIS estimates of PM2.5 concentrations using lidar derived PBL Heights

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ABSTRACT

To provide reasonable forecasts of near surface PM2.5 levels, it is necessary that satellite measurements provide a reasonable estimator of PM2.5 which can be coupled to a transport model. Unfortunately, this requires that the aerosol be homogeneously mixed and that the extent of the PBL be sufficiently accurate. For example, the IDEA product (Infusing satellite Data into Environmental Applications) used by the EPA relies on a static relationship connecting PM2.5 to MODIS aerosol optical depth (AOD) which relies on a static model of the PBL aerosol height. In this paper, we show that the PBL height is far from static and by taking the variable PBL into account, a far better prediction of PM2.5 from the MODIS (AOD) measurements is obtained.

1. INTRODUCTION

NOAA has been directed by congressional mandate to implement an operational air quality forecast system which will provide 24-48hr forecasts of ozone and fine particulate matter (PM2.5) to benefit public health. In order to perform this obligation, NOAA and EPA formed a partnership to transfer scientific advances in air quality monitoring and forecasting into the National Center for Environmental Prediction (NCEP). In support of this effort, the IDEA¹ (Infusing satellite Data into Environmental Applications) product was developed through a joint collaboration from NASA, EPA and NOAA which couples a satellite estimate of AOD² using the MODIS sensor into a NOAA Lagrangian transport model. The Air-Quality forecast is then assessed through the use of the EPA PM2.5 surface monitoring network.

It is clear that the minimum requirements needed so that the IDEA product provides a useful estimate of PM2.5 are as follows:

1. The MODIS satellite should produce an accurate measure of the AOD. In general, MODIS performs the best retrieval in dark vegetative regions which may not be available in urban environments.
2. The vertical profile of the aerosol should be well mixed without any aloft layers.
3. The scene where comparisons are made should be spatially and temporally stable.

4. The PBL height and the aerosol model used in converting AOD to surface PM2.5 should be representative of the actual state of the atmosphere.

It is the purpose of the paper to examine and decouple the different mechanisms that might account for the significant errors observed between the PM2.5 and the IDEA prediction and show the importance of providing an accurate estimate of the PBL height.

2. ASSESSMENT OF MODIS AOD FOR NYC

Since urban areas are particularly relevant due to the health hazards involved in excessive PM2.5, it is particularly important to be able to examine the accuracy of the IDEA product for these scenes. The most obvious problem observed when examining the time series data such as the example in Figure 1 is that the MODIS AOD estimate of PM2.5 very often overestimates the PM2.5 values.

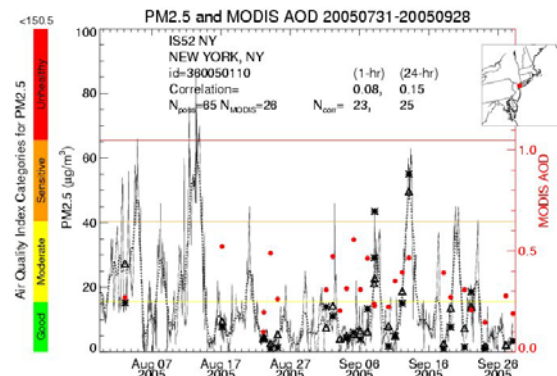


Fig. 1 IDEA matchup between measured PM2.5 and the MODIS estimator based on a static aerosol PBL model.

To begin, it is important to assess the accuracy of the MODIS AOD product over the urban NYC area. In particular, urban areas provide a particular challenge for MODIS since the ground albedo is more complex than for dark surfaces such as vegetation. Therefore, it is useful to understand how MODIS AOT is obtained operationally.

In essence, the algorithm assumes that there are processes (true for vegetation) which correlate the

ground albedos between the VIS 470nm, 660nm channels to the 2160nm channel. Using correlations based on a-priori estimates of land cover type, the 0.47 and 0.66 μm ground reflectances can be estimated thereby allowing an improved estimate of atmospheric reflectance⁴. Based on these principles, the basic approach for an operational and unsupervised aerosol remote sensing algorithm for the MODIS sensor is :

1. Determination of the presence of the dark pixels in the blue (0.47 μm) and red (0.66 μm) channels using their remotely sensed reflectance in the mid- IR channels (2.1 μm).
2. Estimation of the surface reflectance of the dark pixels in the red and blue channels using the measurements in the mid-IR and information on surface type when possible.
3. Determination of the aerosol type using information on the global aerosol distribution and the ratio between the aerosol path radiance in the red and blue channels.
4. Inversion of the measured radiance at TOA into the aerosol optical thickness, volume (or mass) concentration and spectral radiative forcing using radiative transfer look-up tables.

Therefore, if the correlation coefficients are incorrect, the VIS channel ground albedos will be incorrect and significant errors will result in the AOD estimate. To explore this issue, we applied the path radiance method⁵ to decouple the aerosol and land features in a high spatial resolution satellite image of NYC using the Hyperion sensor.

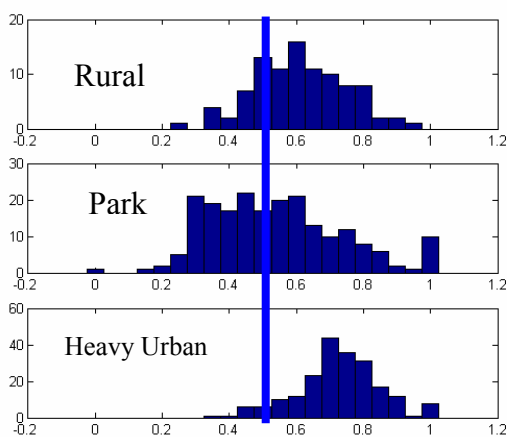


Figure 2. VIS-MIR Ground correlations statistics as compared to MODIS reference

We see that in urban scenes, these coefficients are too low as seen in figure 2. While the vegetation (park) is seen to follow the MODIS correlation prescription, the MODIS correlation values is underestimated for both light urban and heavy urban scenes. It is clear that this error will lead to a MODIS underestimate of the optical depth. This is indeed the case when simultaneous MODIS and an Aeroent Sunphotometer AOD are compared. To insure sufficient homogeneity, a strict matchup procedure was utilized. In particular,

- CIMEL Optical Depth taken between NYC and Brookhaven (5 hour mean to agree within 10%)
- MODIS 10km products. 3 x 3 cells to have std < 20% mean

As a test of the matchup procedure (for the sunphotometer), the AOD's at two different sites (~80km apart) are compared in figure 3.

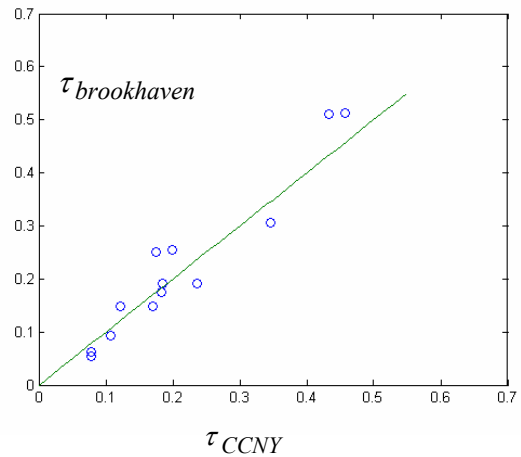


Figure 3. Spatial correlation of temporally stable CCNY Aeroent data sets.

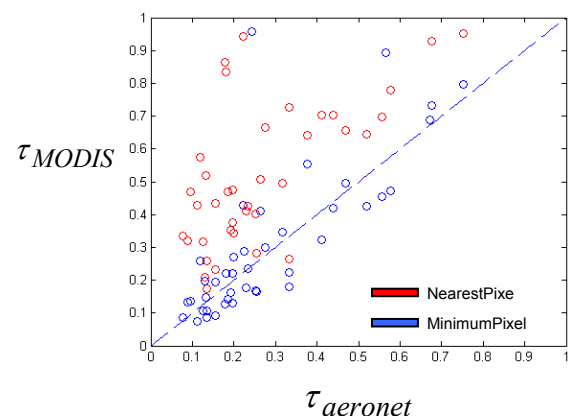


Figure 4. MODIS-Aeroent AOD comparison matchup.

The matchups are presented in Figure 4 above. The results are presented for two different choices of the MODIS pixel in the intercomparison. In the first scenario given by the red pixels, we choose the 3x3 box to be centered at the nearest pixel to the sunphotometer (i.e. Manhattan) and observe how MODIS greatly overestimates AOD relative to the sunphotometer. In the second scenario, the 3 x 3 MODIS box is chosen to be centered around the AOD minimum over a 40km x 40km search space. Such minima were easy to find and were always located north of the City about 15-20km in a very vegetated area. It is clear that the MODIS results taken at an AOD minimum results in a very good correlation. This is clearly due to the fact that AOD minimum is almost always associated with the darkest ground signature which provides the purest atmospheric signal. In addition, the fact that the correlations are good and the bias removed even though the geographic matchup was not exact validates our procedure for maintaining homogeneity. From this result, we see that in order to perform a correct assessment of the IDEA product, it is necessary to choose the MODIS pixel appropriately.

3. PM2.5 VS AEROENT OPTICAL DEPTH SLOPE.

To begin, we explore the linear relationship between the PM2.5 and Aeroent CIMEL (Sky Radiometer) AOD with the particular purpose of testing the static IDEA relationship which assumes $60\mu\text{g}/\text{m}^3 \sim 1.0 \text{ AOD}$. In Figure 5a, we plot the intercomparison between PM2.5 obtained from the EPA site used in the particular IDEA product versus the Aeronet AOD for June 2005. To

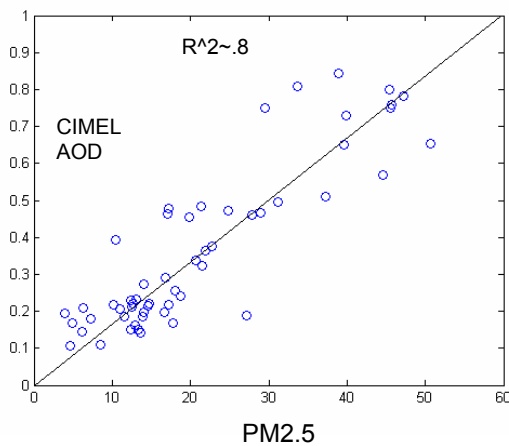


Fig 5a. Intercomparison PM2.5 vs aeroent (June 2005)

optimize the matchups, they are performed as hourly averages and care is made to ensure that the mean

PM2.5 value obtained from all sites in the area vary by no more than 25%. In particular, we note that an excellent linear relationship results and that the static IDEA slope is quite accurate. However, the situation is quite different in the humid as the humidity increases such as August as seen in figure 5b

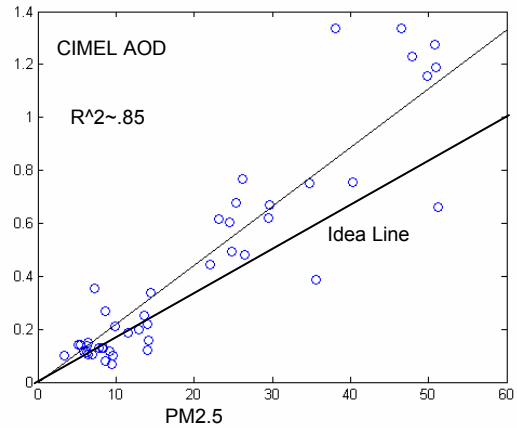


Fig 5b. Intercomparison of PM2.5 vs aeroent (August 2005)

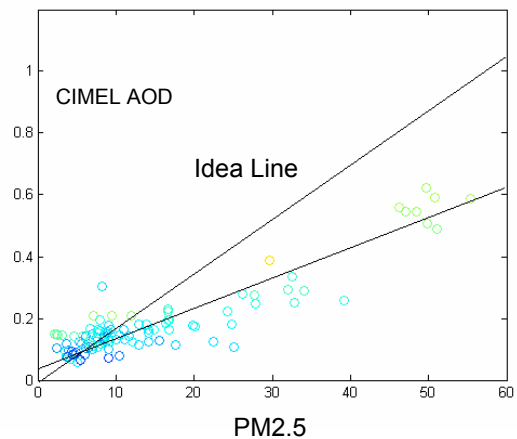


Fig 5c. Intercomparison (Sept. 2005)

This result is not surprising since the combination of temperature and humidity results in an extended PBL. In figure 5c, we present september results which shows a reversal of the PBL height.

4. REGRESSION SLOPE COMPARED TO PBL STATISTICS OBTAINED FROM LIDAR.

It is clear that very significant changes occur in the monthly regression slopes as seen in Figure 6b (~100% variation) which will adversely affect the final PM2.5 estimate. However, in comparing Panels 6a and b, an

inverse relationship between the PBL and the regression slope (Conc. / AOD) is seen.

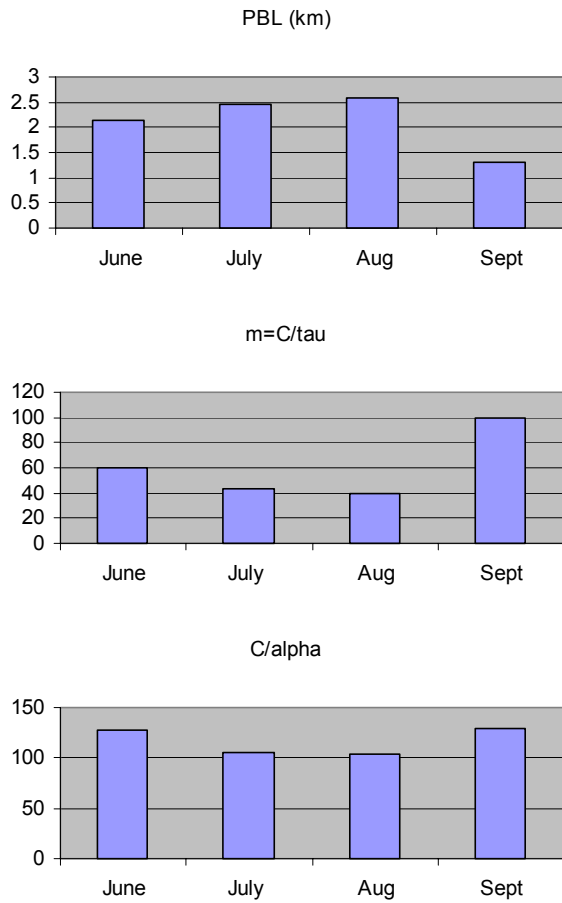


Fig 6 a) Monthly PBL b) regression slope (C/tau) c) regression slope (C/alpha)

To test the inverse relationship, we examine in figure 6c, the product of the two panels remembering that since the optical depth is proportional to the PBL height $\tau \approx \alpha H_{PBL}$. With this relationship, panel c defines the regression slope between PM2.5 concentration and the aerosol extinction directly which is quite stable.

5. CONCLUSIONS

We have examined the possibility of achieving a workable relationship between PM2.5 and MODIS. Under the restrictions of sufficient homogeneity, it is shown that a reasonable estimate of PM2.5 can be achieved if the following procedures are implemented.

1. The MODIS AOD product must show sufficient homogeneity and must be evaluated in a non-urban area.

2. A static relationship between AOD and PM2.5 must be corrected linearly for the PBL.

In particular, taking into account the PBL variations results in a fairly stable (30%) PM2.5 predictor (see Figure 6c) and implies that the aerosol model variations themselves are only a secondary issue. Efforts to obtain PBL through ancillary satellite information and/or climatology are ongoing.

ACKNOWLEDGEMENTS

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