Differentiating between Local and Remote Pollution over Taiwan


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ABSTRACT

In this study, an approach has been developed for differentiating between local and remote pollution over Taiwan, based on the homogeneity (variations of the standard deviation) of both AERONET measurements and NASA MERRA aerosol reanalysis (version 2, MERRA-2) over a 15-year period (2002–2017). The analysis of seasonal variations of the standard deviation of aerosol optical depth (AOD) measurements at six AERONET sites and MERRA AOD data in Taiwan showed that in spring, when remote aerosols dominate, the standard deviation is almost three times lower than in autumn, when local aerosols dominate. This finding was supported by MERRA’s AOD over the open ocean: The total AOD data were used to differentiate between local and remote pollution over both Taiwan and the open ocean in the vicinity of Taiwan. Over Taiwan, MERRA’s total AOD showed a primary maximum in spring and a secondary one in autumn. Over the open ocean, where there are no local sources of anthropogenic aerosols, MERRA’s total AOD showed only one maximum in spring and no maximum in autumn. This suggests that in Taiwan, the maximum in autumn is attributable to local air pollution, whereas the pronounced maximum in spring is mainly caused by air pollution from continental Asia. Analyses of the spatial distribution of MERRA’s 15-year monthly mean winds confirmed the above-mentioned results. Furthermore, similar to the total AOD, MERRA’s sulfate AOD peaked in autumn over Taiwan but not over the oceanic area, indicating the contribution of local emissions of anthropogenic aerosols from the industrial sector. The standard deviation of MERRA’s sulfate AOD in spring is two to three times lower than in autumn, which provides additional evidence that in spring, sulfate aerosols from remote sources are predominant, whereas in autumn, sulfate aerosols from local sources dominate.

Keywords: Local pollution; Remote pollution; AERONET; MERRA-2; MERRA aerosol reanalysis; Taiwan.

INTRODUCTION

Aerosols are an important factor in the atmospheric hydrological cycle and radiation budget, affecting cloud formation, precipitation processes, and climate, including atmospheric processes and climate in the area of Taiwan (Tu and Chou, 2013). Regional air quality is influenced by air pollution from local and remote sources. Differentiating between local and remote pollution is essential to the understanding of their effects. This topic of differentiation between local and remote pollution of similar chemical composition and optical properties was investigated mainly by using the modeling approach (e.g., Cowan and Cai, 2011; Bollasina et al., 2014; Kishcha et al., 2016).

Taiwan is a suitable region for the exploration of this topic. This is because this region is characterized by significant intrusions of anthropogenic aerosols (including emissions of biomass burning) transported from Indochina, on the one hand, and by pollution from local industrial and transportation activities (Chen et al., 1999; Lin et al., 2005; Yen et al., 2013; Wang et al., 2016; Provensal et al., 2017). During certain periods or days in spring, Taiwan is also impacted by the advection of dust originating from the Gobi Desert (Chen et al., 2004; Lin et al., 2007; Wang et al., 2012). Sea salt aerosols, which come from the surrounding sea areas, noticeably contribute to air quality in this island (Li et al., 2016).

Taking into account the above-mentioned significant intrusions of air pollution from remote sources into the Taiwan region as well as the presence of local pollution, it is reasonable to suggest that the air pollution in Taiwan seasonally changes in view of differences in its origin. In the current study, an approach based on homogeneity perspective has been developed to differentiate between local and
remote pollution contributing to seasonal variations of aerosol optical depth over Taiwan. This was carried out using 15-year (from July 2002 till June 2017) aerosol optical depth (AOD) measurements from the local network of AERONET sunphotometer stations, as well as AOD data from NASA MERRA aerosol reanalysis (version 2, MERRA-2) based on the up-to-date GEOS-5 model with aerosol data assimilation.

**METHODOLOGY AND DATA**

**Method**

As mentioned, in order to differentiate between contributions from local and remote pollution to seasonal variations, we used AERONET AOD monthly data from six monitoring sunphotometer stations located in Taiwan (Table 1 and Fig. 1) together with AOD data from NASA MERRA aerosol reanalysis (version 2, MERRA-2). Level 2.0 version of AERONET data (calibrated and screened for clouds) at a standard wavelength of 500 nm was used to analyze seasonal variations of both AERONET AOD and its standard deviation as a measure of AOD homogeneity. Furthermore, we analyzed seasonal variations of monthly AOD data from the NASA MERRA aerosol reanalysis over the Taiwan area (22N–25.5N; 120E–122E) and those over the open ocean area in the vicinity of Taiwan (25.5N–29N; 122.5E–124.5E).

MERRA AOD data during the 15-year period under consideration were used to analyze the spatial distribution of various aerosol species over Taiwan and surrounding areas, as well as their contribution to total AOD. To differentiate between local and remote sulfate aerosols of similar chemical composition and optical properties, we analyzed seasonal variations of MERRA sulfate AOD (and

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<thead>
<tr>
<th>Monitoring site</th>
<th>Geographical coordinates (degrees)</th>
<th>Elevation (m.a.s.l.)</th>
<th>Years of measurements</th>
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<td>27</td>
<td>2013–2017</td>
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<tr>
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<td>50</td>
<td>2002–2016</td>
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<td>High elevated site</td>
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<td>Lulin</td>
<td>23.47°N; 120.87°E</td>
<td>2868</td>
<td>2006–2016</td>
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Fig. 1. Map of the region under study. The black box shows the Taiwan area (22.0N–25.5N; 120E–122E), and the green box shows the open ocean area in the vicinity of Taiwan (25.5N–29N; 122.5E–124.5E). The circles designate the location of AERONET monitoring sites (Table 1). The five small orange boxes (of 0.5° latitude by 0.625° longitude each) are the GEOS-5 model grid boxes located close to the low-elevated AERONET monitoring sites.
its standard deviation as a measure of AOD homogeneity) using sulfate AOD values averaged separately over five GEOS-5 model grid boxes (0.5° latitude by 0.625° longitude each). These boxes were located close to the low-elevated AERONET monitoring sites (Fig. 1, the orange boxes).

Analyses of atmospheric dynamics are essential to support our findings based on both AERONET AOD measurements and reanalysis data. To this end, spatial distributions of 15-year monthly mean MERRA wind vectors in the 700–800 hPa layer were analyzed.

**MERRA Aerosol Reanalysis (Version 2, MERRA-2)**

The NASA Goddard Earth Observing System (GEOS) Model, Version 5, GEOS-5 model is the latest version of the NASA Global Modeling and Assimilation Office (GMAO) Earth system model (Buchard et al., 2017; Randles et al., 2017). GEOS-5 contains components for simulating atmospheric circulation and composition (including atmospheric data assimilation), ocean circulation and biogeochemistry, and land surface processes. Moreover, GEOS-5 includes a module representing atmospheric aerosols (Colarco et al., 2010). This aerosol module is based on a version of the Goddard Chemistry, Aerosol, Radiation and Transport (GOCART) model (Chin et al., 2002), which includes production, transport, and loss processes for the five aerosol species such as desert dust, sulfate, sea salt, black and organic carbon. Interaction between the aerosol species is not included in the model. Both dust and sea salt have wind speed dependent emission functions, while sulfate and carbonaceous species have emissions principally from fossil fuel combustion, biomass burning and bio-fuel consumption, with additional biogenic sources of organic carbon. The sulfate and carbonaceous aerosol emissions used in the GEOS-5 model were derived from a variety of inventories, which were described by Randles et al. (2017, their Table 1). Loss processes for all aerosols include dry and wet deposition, and convective scavenging.

The GEOS-5 model simulates the concentration of the above-mentioned five aerosol species all over the world with a grid spacing of 0.5° latitude by 0.625° longitude. It also includes assimilation of AOD observations from the MODIS sensor on both NASA Terra and Aqua satellites; bias-corrected AOD from the Advanced Very High Resolution Radiometer (AVHRR) instruments; AOD retrievals from the Multispectral Imager Spectroradiometer (MISR) over bright surfaces, and ground-based Aerosol Robotic Network (AERONET) direct measurements of AOD (Randles et al., 2017). The outputs of GEOS-5 model runs from 1980 until the present were used to extend the NASA MERRA reanalysis database to its version 2 (aka MERRA-2) which includes AOD of sulfates, organic carbon, black carbon, mineral dust and sea salt. Note that the MERRA AOD data of various aerosol species are not based on direct observations of those species: These data are based on the above mentioned GEOS-5 model runs. AOD data from MERRA-2 were evaluated and validated by Randles et al. (2017) and Buchard et al. (2017). In the current study, we used the 15-year (from July 2002 till June 2017) monthly AOD dataset from MERRA-2. During the specified period, AOD measurements from the MODIS sensor on board the Aqua and Terra satellites as well as AOD measurements from the MISR sensor were regularly available for data assimilation in GEOS-5.

**RESULTS**

**Spatial Distribution of 15-Year Mean MERRA AOD of Various Aerosol Species**

MERRA aerosol reanalysis allowed us to analyze the spatial distribution of various aerosol species over Taiwan and surrounding areas. First, we analyzed a spatial distribution of MERRA total AOD. The obtained spatial distribution of 15-year mean reanalysis total AOD showed that, because of the proximity of Taiwan to continental Asia, this area is characterized by a significant level of air pollution (Fig. 2). Consequently, a large part of air pollution over Taiwan has anthropogenic origin being caused by industrial, agricultural and transportation activities in continental Asia. As mentioned in the introduction, previous studies showed that anthropogenic aerosols are frequently transported by synoptic wind systems towards Taiwan (Chen et al., 1999; Lin et al., 2005; Wang et al., 2016; Provensal et al., 2017).

Then we analyzed the contribution of three major air pollutants contributing to total AOD using MERRA AOD data. As illustrated in Fig. 3(a), sulfates are the major contributor to total AOD over Taiwan: they are responsible for 59% of the 15-year mean MERRA total AOD. In all seasons, sulfates remain the major contributor to total AOD over Taiwan (Fig. 4). With respect to organic and black carbon AOD, the spatial distribution of AOD shows that carbonaceous aerosols are the second largest contributor to the air pollution, responsible for 18% of the 15-year mean MERRA total AOD (Fig. 3(b)). Carbonaceous aerosols reveal significant seasonal variations with a maximum in spring, with respect to their contribution to total AOD over Taiwan (Fig. 4). With respect to desert dust, reanalysis data showed that the Pacific Ocean and Taiwan in particular, was almost free from dust, on average during the whole 15-year period under study (Fig. 3(c)). During the spring season, the boundary of the dusty area is located close to Taiwan, while in winter, summer and autumn, Taiwan is usually unaffected by desert dust (Fig. 4). As mentioned in the introduction, during certain periods or days in spring, Taiwan is impacted by the advection of dust (Chen et al., 2004; Lin et al., 2007; Wang et al., 2012). However, such short dusty periods cannot be revealed from Figs. 3(c) and 4. In the current study, we do not provide analysis of daily datasets, but a mean situation for a long-term (15-year) time period.

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Fig. 5 represents seasonal variations of total AOD based on the AERONET network of sun photometer measurements in Taiwan, over the 15-year period under study. One can see seasonal variations with the primary maximum in the spring season (March–April) and the
secondary (less pronounced) maximum in the autumn season (September–October). AOD from the low–elevated AERONET monitoring sites (AERONET-L in Fig. 5) is significantly higher than AOD from the high–elevated site in Lulin (AERONET-H). This indicates that, around the year, the main part of air pollution in Taiwan is vertically distributed below 2800 m a.s.l. Note that the AOD measurements at the high–elevated site in Lulin showed only AOD maximum in spring but no noticeable maximum in autumn (Fig. 5). The MERRA total AOD was capable of reproducing each of the two maxima in spring and autumn. Averaged over both the high and low–elevated parts of the Taiwan area, the MERRA AOD is located between AERONET-L and AERONET-H, indicating reasonable correspondence between MERRA AOD and AERONET AOD measurements (Fig. 5).

We analyzed month–to–month variations of the standard deviation of AERONET AOD data (in percentage to average AOD) from the five low–elevated monitoring sites (Fig. 6). The standard deviation of AERONET measurements is the measure of their variability. This graph clearly shows that, in spring (March–April), the standard deviation is almost three times lower than that in autumn (October). Based on these variations of standard deviation of AERONET measurements, it is reasonable to suggest that, in the case of predominant aerosols originating from remote sources, these aerosols should be more evenly distributed over Taiwan than local aerosols. Consequently, in the case of predominant remote aerosols, the variability of AERONET AOD measurements taken at different sites in Taiwan should be relatively low. By contrast, in the case of predominant aerosols originating from some local sources in Taiwan, the variability of AERONET measurements taken at different sites in Taiwan should be relatively high. Thus, our finding that the standard deviation in spring is almost three times lower than the standard deviation in autumn (Fig. 6) indicates that, in spring, aerosols from remote sources are predominant; while, in autumn, aerosols from local sources dominate.

This finding is supported by the analysis of spatial distributions of 15–year monthly mean MERRA wind vectors in the 700–800 hPa layer (Fig. 7). The 700–800 hPa layer is considered as indicative of wind in the lower troposphere, where aerosol transport mainly occurs (Yu et al., 2008; Kishcha et al., 2014; Guo et al., 2017). One can see that, in the spring season (March), prevailing strong west and south–west winds blow mainly from land to sea, causing transport of anthropogenic air pollution (including biomass burning) from its sources in continental Asia towards Taiwan (Fig. 7(a)). Therefore, in spring, aerosols from remote sources are likely to be predominant. By contrast, in autumn (October), weak east winds are observed over Taiwan, indicating insignificant transport of continental air pollution towards Taiwan (Fig. 7(b)). Therefore, in autumn, aerosols from local sources are likely to dominate.

Moreover, our finding (about the origin of the AOD maxima in spring and autumn) is also supported by the analysis of seasonal variations of MERRA total AOD over the open ocean area in the vicinity of Taiwan, where there are no local sources of anthropogenic aerosols (25.5N–29N; 122.5E–124.5E) (Fig. 1). This open ocean area and the Taiwan area (22.0N–25.5N; 120E–122E) are equally distant.
Fig. 3. Spatial distribution of 15-year mean MERRA AOD of (a) sulfate aerosols, (b) organic and black carbon, and (c) desert dust aerosols.
from the coast of continental Asia (Fig. 1). A comparison of seasonal variations of 15-year mean MERRA total AOD over these two areas showed that, over the open ocean area, there is no maximum in the autumn season but only one maximum in the spring season (Figs. 8(a) and 8(b)). The absence of the AOD maximum in autumn over the open ocean area and its presence over Taiwan (in accordance with both MERRA AOD and AERONET measurements (Fig. 8(a))) is evidence of the local origin of this AOD maximum in autumn. The presence of the AOD maximum in spring over both the open ocean area and the Taiwan area (in accordance with MERRA AOD) is evidence of the remote origin of the AOD maximum in spring. Thus, our approach allowed us to differentiate between local and remote pollution contributing to the seasonal variation in total AOD over Taiwan.

The fact that AOD measurements at the high-elevated site in Lulin showed the AOD maximum in spring (Fig. 5) is a clear indication that aerosols from remote sources can be transported at altitudes above 2800 m. Furthermore, the absence of noticeable AOD maximum in autumn at this site is an indication that aerosols from local sources are vertically distributed below 2800 m.

**Local and Remote Sulfate Pollutants in Taiwan**

MERRA aerosol reanalysis allowed us to examine separately AOD of various aerosol species over both Taiwan and the open ocean area. In accordance with MERRA
Fig. 5. Comparison of monthly mean variations of aerosol optical depth (AOD) between AERONET sun photometer measurements and NASA MERRA total AOD in Taiwan (22N–22.5N; 120E–122E) over the 15-year period (2002–2017). AERONET-L represents AOD averaged over the five low-elevated AERONET monitoring sites (Table 1), and AERONET-H represents AOD from the high-elevated Lulin site. The red vertical lines designate the standard deviation of AOD from the five low-elevated sites.

Fig. 6. Monthly mean variations of the standard deviation of AERONET AOD data (in percentage to average AOD) from the five low-elevated monitoring sites.

AOD, during the spring season, sulfate and carbonaceous aerosols are two major contributors to total AOD (Figs. 9(a) and 9(b)). The transport of these anthropogenic aerosols from South East Asia towards Taiwan in spring was studied by Lin et al. (2013). They discussed the climatology and main atmospheric flow patterns controlling this transport.

By contrast to the spring season, during the autumn season, MERRA AOD showed that sulfate aerosols are the main contributor to total AOD over Taiwan, while the contribution of carbonaceous aerosols is essentially lower (Figs. 9(a) and 9(b)). Therefore, based on MERRA AOD, both local and remote sulfate pollutants contribute to the seasonal variations of AOD in Taiwan. Our approach allowed us to distinguish between the sulfate pollutants according to their origin. In particular, MERRA AOD showed the absence of sulfate AOD maximum in autumn in the open ocean area and its presence in the Taiwan area (Figs. 9(a) and 9(b)). This indicates the local origin of this sulfate AOD maximum in autumn. Furthermore, we estimated seasonal variations of MERRA sulfate AOD over the 15-year study period (2002–2017) separately over the five model grid boxes (of 0.5° latitude by 0.625° longitude each). These five boxes were located close to the low-elevated AERONET monitoring sites in Taiwan (Fig. 1, the orange boxes). Fig. 9 represents seasonal variations of MERRA sulfate AOD averaged for these five grid boxes together with the AOD standard deviation. One can see the pronounced sulfate AOD maximum in spring and the less
Fig. 7. Spatial distribution of 15-year mean MERRA wind vectors in the 700–800 hPa layer in (a) March, and (b) October.

Fig. 8. Comparison of monthly mean variations of MERRA total AOD over (a) Taiwan (22.0N–25.5N; 120E–122E) and over (b) the open sea area in the vicinity of Taiwan (25.5N–29N; 122.5E–124.5E), over the 15-year period (2002–2017). AERONET-L represents AOD averaged over the five low-elevated AERONET monitoring sites.
Fig. 9. Comparison of monthly mean variations of MERRA AOD of various aerosol species (such as sulfates (SU), organic and black carbon (OC & BC), desert dust (DU) and sea salt (SS)) over (a) Taiwan (22.0N–25.5N; 120E–122E) and over (b) the open ocean area in the vicinity of Taiwan (25.5N–29N; 122.5E–124.5E), over the 15-year period (2002–2017).

Fig. 10. Monthly mean variations of MERRA sulfate AOD averaged for the specified five model grid boxes (located close to the low-elevated AERONET monitoring sites), over the 15-year period (2002–2017). The vertical lines designate the standard deviation of AOD.

CONCLUSIONS

In this study, an approach has been developed for differentiating between local and remote pollution in Taiwan, based on the homogeneity of both AERONET measurements and NASA MERRA aerosol reanalysis (version 2, MERRA-2) over a 15-year period (2002–2017). The analysis of seasonal variations of the standard deviation of AERONET aerosol optical depth (AOD) measurements and MERRA AOD data in Taiwan showed that in spring, aerosols from remote sources are predominant; by contrast, in autumn, aerosols from local sources dominate. In spring, when remote aerosols dominate, the AOD standard deviation is almost three times lower than in autumn. This finding was supported by MERRA AOD over the open ocean: MERRA’s total AOD data were used to differentiate between local and remote pollution over both Taiwan and the open ocean in the vicinity of Taiwan. Over Taiwan, MERRA’s total AOD showed the primary maximum in spring and the secondary one in autumn. Over the open ocean, where there are no local sources of anthropogenic aerosols, MERRA’s total AOD showed only one maximum in spring and no maximum in autumn. Consequently, the maximum in autumn is determined by local air pollution, while the pronounced maximum in spring is determined mainly by air pollution from continental Asia. The analyses of spatial distribution of MERRA’s 15-year monthly mean winds confirmed the above-mentioned results.

MERRA’s AOD for various aerosol species showed that in Taiwan, both local and remote sulfate pollutants contribute to seasonal variations of AOD. Similar to the total AOD, MERRA’s sulfate AOD exhibited no maximum in autumn over the open ocean and Taiwan, which indicates the local origin of the sulfate AOD maximum in this season. Furthermore, similar to AERONET’s AOD, the standard deviation of MERRA’s sulfate AOD in spring is two to
three times lower than the standard deviation in autumn. This is additional evidence that in spring, sulfate aerosols from remote sources predominate, while in autumn, sulfate aerosols from local sources dominate.

AOD measurements at the high-elevation Lulin AERONET site showed only the AOD maximum in spring and no noticeable maximum in autumn, indicating that aerosols from remote sources were transported at altitudes above 2800 m in spring, while aerosols from local sources were vertically distributed below 2800 m in autumn.

**ACKNOWLEDGMENTS**

The following MERRA-2 datasets were used in this study: a) tavgM_2d_aer_Nx (GMAO 2015a) and b) instM_3d_ana_Np (GMAO 2015b).

**REFERENCES**


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