Vertical variation of optical properties of mixed Asian dust/pollution plumes according to pathway of airmass transport over East Asia

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Abstract:
We use five years (2009 – 2013) of multiwavelength Raman lidar measurements at Gwangju, Korea (35.10° N, 126.53° E) for the identification of changes of optical properties of East Asian dust in dependence of its transport path over China. Profiles of backscatter and extinction coefficients, lidar ratios, and backscatter-related Ångström exponents (wavelength pair 355/532nm) were measured at Gwangju. Linear particle depolarization ratios were used to identify East Asian dust layers. We used backward trajectory modelling to identify the pathway and the vertical position of dust-laden air masses over China during long-range transport. Most cases of Asian dust events can be described by the emission of dust in desert areas and subsequent transport over highly polluted regions of China. The Asian dust plumes could be categorized into two classes according to the height above ground in which these plumes were transported: (cases I) the dust layers passed over China at high altitude levels until arrival over Gwangju, and (case II) the Asian dust layers were transported near the surface and the lower troposphere over industrialized areas before they arrived over Gwangju.

We find that the optical characteristics of these mixed Asian dust layers over Gwangju differ in dependence of their vertical position above ground over China and the change of height above ground during transport. The mean linear particle depolarization ratio was 0.21±0.06 (at 532 nm), the mean lidar ratios were 52±7 sr at 355 nm and 53±8 sr at 532 nm, and the mean Ångström exponent was 0.74±0.31 in case I. In contrast, plumes transported at lower altitudes (case II) showed low depolarization ratios, and higher lidar ratio and Ångström exponents. The mean linear particle depolarization ratio was 0.13±0.04, the mean lidar ratios were 63±9 and 62±8 sr at 355 and 532 nm, respectively, and the mean Ångström exponent was 0.98±0.51. These numbers show that the optical characteristics of mixed Asian plumes are more similar to optical characteristics of urban pollution. We find a decrease of the linear depolarization ratio of the mixed dust/pollution plume in dependence of transport time if the pollution layer travelled over China at low heights, i.e., below approximately 3 km above ground. In contrast we do not find such a trend if the dust plumes travelled at heights above 3 km over China. We need a longer time series of lidar measurements in order to determine in a quantitative way the change of optical properties of dust with transport time.

Key words: lidar, Asian dust, optical properties, particle depolarization ratio, mixing, vertical distribution, long-range transport
1. Introduction

Desert dust is the most abundant natural source of atmospheric particles over land. Its light-absorption capacity is strong in the ultraviolet regions of the solar spectrum (Jacobson 2012). The light-absorption capacity depends on the proportions of Fe$_2$O$_3$, Al$_2$O$_3$, SiO$_2$, CaCO$_3$, MgCO$_3$(s), clays, and other substances. The transport patterns of dust over North Africa and East Asia as well as the vertical distribution of dust change intra- and inter-annually. Thus the influence of dust on the atmosphere’s radiation balance is complex (Griggs and Noguer, 2002; Mahowald et al., 2006; Durant et al., 2009). Central East Asia has large desert regions. Asian dust particles that originate from the Taklamakan desert in west China and the Gobi desert in Mongolia and northwest China (Fig. 1) influence the regional climate over East Asia and can be found as far as the west coast of North America (Husar et al., 2001; McKendry., 2001; Huang et al., 2008). East Asian dust is particularly complicated as it usually travels over densely populated and highly industrialized areas of China before it moves out over Pacific Ocean. During transport over East Asia dust mixes with pollutants such as industrial soot, toxic material, and acidic gases (Sun et al., 2005).

Field campaigns, such as ACE-Asia (Huebert et al., 2003) and ADEC (Mikami et al., 2006) significantly added to our knowledge of the radiative effects of Asian dust. Carrico et al. (2003) and Yu et al. (2006) found differences of dust optical properties as the result of the mixing of dust with anthropogenic pollution between source regions of dust and observation sites downwind of its source regions. The mixing between Asian dust and industrial pollutant particles has significant influence on the size distribution and the chemical composition of aerosol plumes (Wang et al., 2007; Sun et al., 2010).

There exist few studies on the degree of mixing that occurs between dust and pollution during transport, the effect of the direction of dust transport across China, and the vertical distribution of Asian dust layers during long-range transport over China. There still is
a lack of understanding of how much of the mixing of dust with pollutants depends on the vertical distribution of dust when it passes over source regions of anthropogenic pollution in East Asia. One reason of our limited knowledge is that there are only few vertically-resolved, long-term observations of pollution over East Asia.

LIDAR (LIght Detection And Ranging) is a powerful technique for measuring the vertical distribution of atmospheric aerosols with high temporal and spatial resolution. In this study we use Raman lidar data taken at Gwangju, South Korea, between 2009 and 2013. In our study we focus specifically on lidar observations of Asian dust layers as they passed over China. We use backward trajectory analysis with HYSPLIT (HYbrid Single Particle Lagrangian Integrated Trajectory) (Draxler and Rolph, 2003) model to identify the transport pathway and the vertical distribution of the Asian dust layers during long-range transport.

The main objective of this study is to investigate the variation of optical properties of mixtures of Asian dust with anthropogenic pollution in dependence of the pathways and vertical distributions of these mixed dust layers during long-range transport. We identify these dust layers by the linear particle depolarization ratio. We present vertically-resolved optical properties such as lidar ratio and Ångström exponent. We also categorize the optical properties of these pollution plumes according to their transport pathway and their vertical distribution.

Section 2 presents the methods used in this study. Section 3 presents our results. We discuss our results and summarize our findings in section 4.

2. Methodology

2.1 GIST Multi-wavelength Raman lidar

The lidar station, dubbed MRS.LEA (Multi-wavelength Raman Spectrometer Lidar in East Asia) of the Gwangju Institute of Science and Technology (GIST) is located at 35.10°
N, 126.53° E in the west-south-western part of the Korean peninsula (Fig. 1).

A description of the lidar system is given by Noh et al. (2007, 2008). The light source of the lidar is a pulsed Nd:YAG laser that emits light pulses at 355 nm, 532 nm, and 1064 nm. The laser output power is 140, 154, and 640 mJ at the three emission wavelengths. The pulse repetition rate is 10 Hz. We use a beam expander at 532 nm and 1064 nm in order to reduce the divergence of the emitted light. The receiver consists of a 14-inch Schmidt-Cassegrain telescope. The signals collected by the receiver telescope are separated according to wavelength with beam splitters and then transmitted to photomultiplier tubes (PMT). Transient recorders with 12-bit analog-to-digital converters and 250-MHz photon counters are used for processing the output signals of the PMTs. The system allows us to retrieve vertical profiles of the particle backscatter coefficients at 355, 532, and 1064 nm, the particle extinction coefficients at 355 and 532 nm, the linear particle depolarization ratio at 532 nm, the water-vapor mixing-ratio, and profiles of silicon-dioxide (Müller et al., 2010; Tatarov et al., 2011). Profiles of silicon-dioxide (quartz) can be used as a proxy of the concentration of mineral dust. In this contribution we use the signals needed for measuring particle backscatter and extinction coefficients at 355 and 532 nm and the linear particle depolarization ratio at 532 nm. The measurements were carried out at night time under cloud-free conditions.

The profiles of particle backscatter coefficients ($\beta_p$) at 355 and 532 nm were calculated with the Raman method (Ansmann et al., 1992b). The overlap effect which describes the incomplete overlap between outgoing laser beam and field of view of the receiver telescope is cancelled out for the case of profiles of the backscatter coefficient because the ratios of two signals (elastic signals from particles and molecules and the nitrogen Raman signals) are computed (Wandinger and Ansmann, 2002). In that way we can retrieve vertical profiles of the backscatter coefficient to 400 m above ground. The vertical profiles of the aerosol extinction coefficients ($\alpha_p$) at 355 and 532 nm were derived with the
use of the nitrogen vibration Raman signals at 387 and 607 nm (Ansmann et al., 1990), respectively. The aerosol extinction coefficients can be retrieved above 780 m and 540 m above ground at the measurement wavelengths of 355 nm and 532 nm. We derive particle extinction-to-backscatter ratios (lidar ratios, denoted as $S$ in this contribution) at 355 and 532 nm from the profiles of $\beta_p$ and $\alpha_p$. The lidar ratios can be used for aerosol typing (Müller et al., 2007). Murayama et al., (2004) find values of $S = 48.6$ sr at 355 nm and $S = 43.1$ sr at 532 in a well-isolated Gobi dust-laden layer observed above 4 km over Tokyo. De Tomasi et al. (2003) report an $S$ value less than 50 sr at 351 nm for a Saharan dust layer. Values of $S$ at 355 nm ranged between 50 sr and 80 sr for dust observed over Leipzig, Germany (Mattis et al., 2002). In contrast, Ferrare et al. (2002) report a high value of 68±12 sr of the lidar ratio at 355 nm. This high lidar ratio was associated with air masses advected from urban/industrial areas. Omar et al. (2009) finds values of 65-70 sr for the lidar ratio at 532 nm. The numbers describe continental-polluted aerosols and polluted dust.

The backscatter-related Ångström exponent for the wavelength pair of 355/532 nm (denoted as $A_\beta$) is computed, too. The backscatter-related Ångström exponent is a good indicator of the size of particles. High values (>1) are typically observed for accumulation mode particles such as fresh biomass-burning particles. Low values (~0) are observed for coarse mode particles such as Saharan dust or Asian dust (Eck et al., 1999; Sakai et al., 2002, Chen et al., 2007). The values of 0.2-0.3 are reported as the values of $A_\beta$ for Saharan dust (Murayama et al., 2002; Tesche et al., 2009). Chen et al. (2007) and Müller et al. (2010) find values of 0.7-1.5 for $A_\beta$ for a mixture of mineral dust with urban haze. Values of 0.8-1.4 for $A_\beta$ were found for heavily polluted continental aerosol layers (Franke et al., 2003).

The depolarization ratio is used as indicator of particle shape (Bohren and Huffman, 2008). High values of the depolarization ratio of 0.3 to 0.35 at 532 nm indicate nearly pure dust (Sugimoto and Lee, 2006; Freudenthaler et al., 2009). For example, Freudenthaler et al.
(2009) report a value of $\delta_p = 0.31$ at 532 nm for Saharan dust observed during SAMUM 2006. Lidar observations were carried out close to the Taklamakan desert (Iwasaka et al., 2003) and the Gobi desert (Yi et al., 2014). We assume that these dust layers exhibit nearly pure dust conditions as anthropogenic pollution sources in these isolated areas are sparse. Values of $\delta_p$ are in the range of 0.3 to 0.35 at 532 nm (Iwasaka et al., 2003; Yi et al., 2014). Small values, e.g., values from 0.08 to 0.1 usually are an indicator that dust is mixed with spherical particles (Murayama et al., 2004; Chen et al., 2009; Tesche et al., 2009; Burton et al., 2013). Anthropogenic aerosols normally are spherical with a small depolarization ratio (Pan et al., 2015). The degree of depolarization decreases as the sphericity of particles increases. The depolarization ratio is dependent on the mixing ratio of dust with spherical particles (Somekawa et al., 2008). For instance, Burton et al. (2013) report values of $\delta_p = 0.13-0.20$ and 0.03-0.07 at 532 nm for polluted dust and urban aerosol particles, respectively.

Parallel polarized and perpendicular polarized signals are measured at 532 nm. The linear volume depolarization ratio (aerosols + molecules) $\delta$ is defined as

$$\delta = \frac{P_\perp}{P_\parallel + P_\perp}. \quad (1)$$

$P_\perp$ and $P_\parallel$ denote the backscatter signal intensities that are polarized perpendicular and parallel with respect to the plane of polarization of the emitted laser beam, respectively. The $\delta$ can be also defined as $P_\perp/P_\parallel$ (Cairo et al., 1999). We calculated the $\delta$ by using both definitions and compared the difference between the derived values. The results from each individual definition agree within the uncertainty of our depolarization ratio measurements (Tesche et al., 2009; Shin et al., 2013).

The linear particle depolarization ratio $\delta_p$ differs from $\delta$ as it depends on the concentration of particles in relation to the concentration of air molecules. In this contribution we use the linear particle depolarization ratio according to the definition by Shimizu et al.
\[ \delta_p = \frac{\delta(z) R_B(z) - \delta m}{R_B(z) - 1} . \]  

(2)

The term \( \delta_m \) is the linear depolarization ratio of air molecules at the wavelength and bandwidth of the emitted laser wavelength. We used the value \( \delta_m = 0.0044 \) (Behrendt and Nakamura, 2002). This value takes account of our interference filters which have a full width at half maximum of 1.0 nm. \( R_B(z) \) is the backscatter ratio, expressed as \( (\beta_p + \beta_m) / \beta_m \) at altitude \( z \). \( \beta_m \) denotes the backscatter coefficient of atmospheric molecules. The calibration of the polarization channels was carried out by using rotating polarizers following the methodology explained by Tesche et al. (2009) and Freudenthaler et al. (2009).

2.2 Dust Layer Identification

We use the profiles of the linear particle depolarization ratio for the identification of the Asian dust layers. An example of how the Asian dust layer was determined is shown in Figure 2. The Asian dust plume reached Korea on 22 April 2012. Figure 2 shows the time-height cross section of the range-corrected backscatter signals and the linear volume depolarization ratio at 532 nm. Figure 2 also shows the mean profiles of \( \delta \) and \( \delta_p \), \( S \) at 355 and 532 nm, and \( A_B \) for the measurement from 13:15 to 14:05 UTC.

Values of \( \delta_p \) for individual aerosol types are reported in literature, e.g. \( \delta_p \) for Asian dust particles varies from 0.08-0.35 (Murayama et al., 2004; Shimizu et al., 2004; Chen et al., 2009; Burton et al., 2013; Shin et al., 2013) at 532 nm. Asian dust generally mixes with pollution during long-range transport which leads to variable \( \delta_p \). Thus, this range of 0.08-0.35 likely describes mixtures of dust with anthropogenic pollution. For instance, Chen et al. (2009) uses 0.08 as threshold value to identify dust in pollution. Furthermore, optical properties may also change during long-range transport. Shimizu et al. (2004) define 0.1 as
threshold value for the determination of polluted dust. In this study we used 0.08 as threshold value of $\delta_p$ to identify dust.

In figure 2, the layer between 2.7 km and 4.6 km (layer II) contains Asian dust particles as suggested from the values of $\delta_p$, which are higher than 0.16. The mean value of $\delta_p$ in the layer between 1.2 km and 2.5 km (layer I) is 0.11 and thus also points to the presence of dust particles though the concentration of dust particles compared to the concentration of particles of anthropogenic pollution may be lower in layer I compared to layer II.

Other aerosol optical properties in layer I and layer II differ, too. The values of the $S$ in layer I are $64 \pm 4$ sr and $66 \pm 4$ sr at 355 and 532 nm, respectively. The values of the $S$ in layer II are as low as $55 \pm 4$ sr and $55 \pm 3$ sr at 355 and 532 nm, respectively, see Fig. 2d. The standard deviations were computed for the lidar ratios in each of the layers we could identify.

The values of $\beta$ in layer I are ~0.93 and thus considerably higher than in layer II where we find a value of ~0.42. These numbers suggest that the concentration of small particles is higher in layer I than in layer II, respectively that the mean size of particles in layer I is smaller than the mean size of particles in layer II. Regarding the interpretation of the numbers of $\beta$ we need to keep in mind that the backscatter-related Ångström exponent not only depends on particle size but also on the complex refractive index and particle shape. The same holds true for the values of $S$. The different numbers thus could also result from differences in particle shape and their absorption properties in these mixed Asian dust layers.

### 2.3 Analysis of Backward Trajectories and Model Simulations of Pollution Emissions

We used the HYSPLIT model (Draxler and Rolph, 2003) to generate 120 hours backward trajectories for air parcels arriving above our lidar site. The trajectories describe the different altitude levels in which dust was transported prior to the lidar observations. They also allow us to trace back the origin of the dust layers and the transport path.
The Monitoring Atmospheric Composition and Climate (MACC) global air quality service of the European Centre for Medium-Range Weather Forecasts (ECMWF) provides a re-analysis of global atmospheric composition. The re-analysis assimilates satellite data, e.g. total aerosol optical depth (AOD) which is provided by the Moderate Resolution Imaging Spectroradiometer (MODIS), into a global model and data assimilation system to correct for model departures from observational data (Belouin et al., 2013; Inness et al., 2013). This re-analysis provides fields of aerosols, namely mineral dust, black carbon, organic matter, and sulphate, as well as chemically reactive gases, and greenhouse gases. We used the aerosol AOD from the MACC re-analysis to determine the intensity of pollution (AOD) in densely populated and industrialized regions along the transport path of the dust layers and to investigate the influence of anthropogenic pollution particles on the variation of the optical properties of Asian dust.

3. Results and discussion

We present data that cover the time from 2009-2013. During this time we observed 38 Asian dust layers on 32 days. These Asian dust layers were identified on the basis of the linear particle depolarization ratio measurements as described in section 2.2. The vertical profiles of the linear particle depolarization ratio allow us to determine the vertical distribution of the Asian dust layers.

Figure 3 shows the frequency distribution of $\delta_p$, $S$, and $A_\beta$ for the observation period and the transport pathways of each Asian dust plume observed during that time. The average value of $\delta_p$ for all observed Asian dust layers is 0.17±0.02. The average values of $S$ are 57±6 sr at 355 nm and 57±7 sr at 532 nm. The mean value of $A_\beta$ is 0.84±0.37. The optical properties of each individual Asian dust layer vary over a wide range of values. We find values of 0.08-0.33 for $\delta_p$, 38-83 sr for $S$ at 355 nm, 41-73 sr for $S$ at 532 nm, and 0.38-1.71
for $\beta$. The maximum value of $\delta_p$ is 0.33 at 532 nm. The minimum values of $S$ at 355 nm and 532 nm are 38 sr and 41 sr, respectively. The minimum value of $\beta$ is 0.38. This maximum value of $\delta_p$ and the minimum values of $S$ at 355 nm and 532 nm and $\beta$ are similar to the values of optical properties for pure dust particles.

76% of $\delta_p$ at 532 nm are located in the range between 0.08 and 0.20. 53% of the values of $S$ at 355 nm are in the range between 60 sr and 85 sr. 47% of the values of $S$ at 532 nm vary between 60 sr and 75 sr. The Ångstöm exponents ($\beta$) vary between 0.80 and 1.71 and 52% of all cases are in the interval. These values are different from the values of optical properties of pure dust.

We speculate that these differences of the values of the optical properties of dust particles are caused by the effect of long-range transport during which dust mixes with anthropogenic pollution or biomass burning smoke when passing over industrialized/densely populated regions in China, see figure 3.

3.1 Qualitative Analysis of the Variation of Optical Properties of Mixed-Dust in Dependence of Pollution Levels

We divided the dust layers into two episodes. The two episodes differ according to the level of pollution emissions along the transport pathway of the dust plumes. The separation of our measurements into these two episodes was done on the basis of the distribution of aerosol optical depth (AOD) of anthropogenic pollution over China. The Asian dust layers were classified as “more polluted”, i.e., “MP” Asian dust when the modelled AOD of anthropogenic pollution on that day was higher than the average AOD (modelled) of all 32 observation days considered in this study. In contrast, Asian dust layers that passed over China during episodes of lower AOD, i.e., AOD was below the mean value of modelled AOD of all 32 observation days, are denoted as “less polluted”, i.e., “LP” Asian
We used model results by MACC and backward trajectory analysis (see section 2.3) for the interpretation of our lidar results as we do not have direct observations of pollution, e.g. particle optical depth, lidar ratios, the linear particle depolarization ratios, and Ångström exponents along the transport path of the pollution plumes. The reliability of inferring AOD of pollution from MACC re-analysis is validated by comparing it to results from AERONET sunphotometer measurements. MACC model is widely used to estimate AOD of pollution (Bellouin et al., 2013; Cesnulyte et al., 2014).

Figure 4 shows the distribution of aerosol optical depth (AOD) at 550 nm for dust and anthropogenic pollution on 2 days. These pollutants include organic matter, black carbon, and sulphate aerosol. The pollution AOD was computed with the MACC model using re-analysis data of ECMWF. The re-analysis data from the MACC model can be downloaded at the web page of ECMWF (http://apps.ecmwf.int/datasets/data/macc-reanalysis/). Fig. 4 shows that Asian dust particles emitted from the Taklamakan and the Gobi desert were transported across China. The model results of AOD of anthropogenic pollutants over China for 10 April 2010 are significantly higher than the model results of AOD on 8 March 2013.

Figure 5 shows the scatter diagram of $\bar{\Delta}_p$ and $S$ at 355 nm and 532 nm versus $\delta_p$ in dependence of the transport events denoted as MP and LP. The mean value of $\delta_p$ of the Asian dust layers denoted as “LP” cases ranges between 0.08 (threshold value that we use to identify dust) and 0.33. The corresponding values of $\bar{\Delta}_p$ vary between 0.38 and 1.71. The lidar ratios range between 38 sr and 83 sr at 355 nm and between 41 sr and 73 sr at 532 nm. The negative correlation of $\delta_p$ with $\bar{\Delta}_p$ indicates that the impact of the non-spherical particles (Asian dust with high $\delta_p$) on the backscattered light decreases with increasing $\bar{\Delta}_p$. Higher values of $\bar{\Delta}_p$ indicate a considerable concentration of anthropogenic pollution particles which
in turn results in lower values of $\delta_p$, of the mixed dust/pollution plumes.

Lower values of $\delta_p$ are dominantly found in the domain where lidar ratios are above 60-70 sr, except for a few cases. Comparably high lidar ratios are associated with air masses from urban/industrial areas (Noh et al., 2007; Müller et al., 2007; Burton et al., 2012). We find high values of $\delta_p$ for lidar ratios of $57\pm7$ sr at 355 nm and $55\pm7$ sr at 532 nm.

With regard to the MP cases the mean $\delta_p$ varies from 0.08 to 0.30. The corresponding values of $A_\beta$ vary between 0.42 and 1.56. The lidar ratios vary between 44 sr and 74 sr at 355 nm and between 48 sr and 72 sr at 532 nm, respectively.

Figure 5(d-f) shows a negative correlation of $\delta_p$ with $A_\beta$ and $S$ at 355 nm and 532 nm. The mean values of the LP and MP cases are summarized in table 1. The transport pathway of dust over eastern China should influence the degree to which anthropogenic aerosols in the industrial areas contribute to the change of optical properties of dust. However, we do not find significant differences between the LP cases and MP cases. We assume that there is another factor that influences the change of the optical properties of the dust layers we observed.

3.2 Influence of pathway and vertical distribution of anthropogenic pollution on optical properties of Asian dust

We classified the Asian dust plumes into 2 categories with regard to height above ground when they passed over regions of anthropogenic emissions. We used 3 km height above ground for the classification. The height of 3 km is reported as the planetary boundary layer. Pollutants emitted at the surface predominantly stay in the planetary boundary layer (Noh et al., 2007; Xie et al., 2015). We assume that height above ground influences how much anthropogenic pollution may mix with the dust layers and thus changes the optical properties of the dust layers. The vertical positions of the dust plumes above ground during
transport over China were inferred from the model results. We assume that the height of the
dust plumes above ground can be distinguished by HYSPLIT model results although the
results may have a certain error because of the spatial and temporal complexity of the
meteorological fields involved in the computations.

Figure 6 shows the transport pathway and the change of the vertical position of the
dust plumes during transport to our lidar site. It is clear that backward trajectories cannot
provide us with information on the concentration of dust and anthropogenic pollution in the
air masses prior to observation over Korea. Still, backward trajectories show if the air masses
originated from or nearby the desert regions, and whether the air masses passed over densely
populated/industrialized regions.

Case I includes those Asian dust plumes that passed over industrialized areas in
China at high altitude level (> 3km height above ground) as shown in figure 6a. The Asian
dust plumes were classified as Case II when they were transported through the near
surface/lower troposphere (< 3km height above ground) over industrialized areas in China,
i.e., longitude range between 110° E and 125° E; the locations of industrialized and densely
populated regions in China are shown in figure 1.

The mean values of the linear particle depolarization ratios of the Asian dust plumes
we observed are lower compared to the linear particle depolarization ratios of pure dust
particles. For example, Freudenthaler et al. (2009) report a value of $\delta_p = 0.31$ at 532 nm for
pure Saharan dust observed during SAMUM 2006.

The values of $\delta_p$ and the corresponding values of $A_\beta$ and $S$ at 355 nm and 532 nm for
the cases I and II are also shown in figure 6. The corresponding mean values of the
parameters of these two cases are summarized in table 2. The frequency distribution of $\delta_p$ at
532 nm, $A_\beta$ (wavelength range 355/532 nm), and $S$ at 355 nm and 532 nm for the
corresponding classified clusters are also shown in Figure 7.
We find different clusters of the optical properties of the dust layers when we take into consideration their vertical position during transport. The cases I show larger values of $\delta_p$ compared to the depolarization ratios in cases II. On average, $A_\beta$ of case I is smaller than $A_\beta$ of case II. The average values of $\delta_p$ and $A_\beta$ are 0.21±0.06 and 0.74±0.31, respectively, for case I. In contrast, $\delta_p$ and $A_\beta$ are 0.13±0.04 and 0.98±0.35, respectively, for case II. The lowest values of $S$ at 355 nm and 532 nm are also measured for high values of $\delta_p$ (0.21±0.06). We find values of 52±7 sr at 355 nm and 53±8 sr at 532 nm, respectively, for case I. Comparably high values of $S$ were found for case II, i.e. 63±9 sr at 355 nm and 62±8 sr at 532 nm. In that case the value of $\delta_p$ is 0.13±0.04.

There are several previous studies that report on linear particle depolarization ratios of polluted dust after long-range transport. According to these studies the observed dust particles were partly/completely mixed with anthropogenic pollution (Sakai et al., 2002; Müller et al., 2003; Shimizu et al., 2004; Chen et al., 2007). As a result of the mixing of dust with anthropogenic pollution, the values of $\delta_p$ were lower than the values of pure dust, which is estimated to be 0.3-0.35 (Murayama et al., 2004; Freudenthaler et al., 2009). Likewise, the values of $A_\beta$ and $S$ also differ compared to the values of $A_\beta$ and $S$ of pure dust.

We assume that the dust particles carried more anthropogenic pollution in cases where the air masses travelled near the surface. Consequently, the optical characteristics of the dust/pollution layers of case II are dominated by the optical properties of anthropogenic pollutants. In contrast, the optical properties of dust layers that travelled at high altitudes (case I) are less influenced by urban/industrial pollutants. Thus, the optical properties of these dust layers are more likely to be those of pure dust.

The Asian dust plumes were classified into 4 categories. We considered not only the level of pollution emissions along the transport pathway, i.e., “MP” Asian dust and “LP” Asian dust, but also the vertical position of the layers when they passed over polluted regions.
of China ("below 3km" and "above 3km"). Figure 8 shows scatter diagrams of $A_{\beta}$ (wavelength range 355/532 nm), and $S$ at 355 nm and 532 nm versus $\delta_p$ at 532 nm in dependence of the level of pollution emission and the vertical position. The frequency distribution of $\delta_p$ at 532 nm, $A_{\beta}$ (wavelength range 355/532 nm), and $S$ at 355 nm and 532 nm for the corresponding clusters are shown in Figure 9. The corresponding mean values of the optical parameters of those clusters are summarized in Table 3. We expect that the optical properties of Asian dust change most if pollution levels (in terms of AOD) are high, (MP Asian case) and when the corresponding air masses passed over industrialized area of China at low altitude (below 3km height above ground). The mean values of $\delta_p$ at 532 nm and $A_{\beta}$ are 0.13±0.04 and 1.09±0.30, respectively, for this case which is denoted as “MP_below 3km”. The mean values of $S$ are 61±10 sr at 355 nm and 64±7 at 532 nm. However, these values of optical properties of dust for MP_below 3km are not significantly different from the case of “LP_below 3km”. In that case the mean values of $\delta_p$ at 532 nm and $A_{\beta}$ are 0.13±0.03 and 1.00±0.38, respectively. The mean values of $S$ are 64±9 sr at 355 nm and 62±8 at 532 nm.

The values of optical properties between “MP” and “LP” at high altitude also do not differ significantly. The mean values of $\delta_p$ at 532 nm, $A_{\beta}$, and $S$ are 0.24±0.05, 0.58±0.14, and 53±5 at 355 nm and 53±2 at 532 nm, respectively, for the case "MP_above 3km". The highest values of $\delta_p$ and lowest values of $A_{\beta}$ are found for this case.

In the case of “LP_above 3km” the mean values of $\delta_p$ at 532 nm and $A_{\beta}$ are 0.21±0.05 and 0.65±0.20, respectively. The mean values of $S$ are 51±8 sr at 355 nm and 49±9 sr, respectively. We believe that the changes in the optical properties of Asian dust depend on the vertical position of the dust plume rather than the level of pollution emission during transport.

The clusters denoted as Case I and Case II were classified according to the altitude (above ground) at which the dust-laden air masses passed over industrialized/populated regions of China. The differences of the optical properties of the dust layers are shown in
The corresponding values of the optical characteristics of the Asian dust layers at each individual height are summarized in Table 4. The frequency distributions of $\delta_p$ at 532 nm, $A_\beta$ (wavelength range 355/532 nm), and $S$ at 355 nm and 532 nm for the corresponding cluster are also shown in Figure 11. The difference of the optical characteristics of East Asian dust layers that travelled in surface-near heights and at high altitudes is obvious. The values of $\delta_p$, $A_\beta$, and $S$ are $0.12\pm0.01$, $1.00\pm0.43$, and $63\pm7$ sr at 355 nm and $64\pm6$ sr at 532 nm, respectively, when Asian dust passed over China below 1 km height above ground. These values reflect the fact that the optical properties of the dust/pollution plumes are dominated by the anthropogenic part of the particles in these plumes. Lower values of $\delta_p$ represent the dominance of spherical particles, i.e. the presence of urban pollution. High values of $A_\beta$ indicate that small particles dominate in the lower altitude level. The high lidar ratio also indicates the presence of urban pollution which tends to be more light-absorbing (Müller et al., 2007). In contrast, values for $\delta_p$, $A_\beta$, and $S$ are $0.23\pm0.04$, $0.60\pm0.17$, and $50\pm6$ sr at 355 nm and $49\pm5$ sr at 532 nm, respectively, after the dust layers had passed over China at high altitudes, i.e., above 3 km. These values more likely reflect the optical characteristic of Asian dust particles that are less affected by the contribution of anthropogenic pollution. The optical properties of Asian dust layer observed in our study reflect mixtures between different aerosol types.

We notice that these variations of the optical properties of Asian dust layers may not only result from external mixing. Hygroscopic growth, aging and deposition during transport, and internal mixing might also affect dust properties (Burton et al., 2014). The interpretation of the mixing state of Asian dust is a challenging task. The mixing state depends on many variables which are poorly known. Sugimoto et al. (2015) tried to identify the mixing state of Asian dust (internal mixing or external mixing) by using analytical relationships inferred from lidar observation. However, we will not go into details here. We
assume that most of the Asian dust observed in this study was externally mixed.

The altitude in which the Asian dust layers passed over China have significant influence on their optical characteristics. In our study, we took 3 km above ground as threshold value as we observed a notable change of optical properties of the dust/pollution plumes if they travelled above or below 3 km height above ground. Pollution particles below 3 km could mix and interact with Asian dust particles (more influence). In contrast, we assume that optical properties of dust particles above 3 km are not that much influenced by anthropogenic pollution as the mixing of pollution into these heights is less intense.

We emphasize that this threshold value of 3 km is merely a best estimate which is governed by the set of data we have at hand. We lack in additional information that would allow us to refine our data analysis. For example a longer time series of lidar measurements, (vertically resolved) observations of pollution transported over China, measurements under much more variable meteorological conditions, additional modelling results, just to name a few reasons, might change this threshold value.

Figure 12 shows scatter diagrams of optical properties of Asian dust versus the transport time. The correlation study is based on HYSPLIT model results, our profiles of $\delta_p$, $A_p$, and $S$, and the time (in hours) the Asian dust spent in polluted regions over China during the transport. We can only use HYSPLIT results as an estimate of the total transport time and the time the plumes spent over pollution regions of China. The total transport time may have considerable uncertainty. We need to decide from the trajectories the start point of dust emission and this means we take the time when the air parcel (defined by its trajectory) left one of the desert regions in Central Asia. The height above ground during transport and the time the plumes spent over pollution regions also contains uncertainty as we neither have direct measurements of the height distribution of the plumes over China during transport nor do we have information on the pollution levels over China while the desert plumes travelled
over China in the various height layers. We can merely assume that the likelihood of mixing with dust and pollution increases the lower the dust travels above ground and the longer it travels at low heights.

We again used our classification of Case I and Case II. However, we refined the vertical resolution to 5 height layers, i.e. transport occurred below 1 km, from 1-2 km, from 2-3 km, from 3-4 km, and above 4 km. We wanted to test if a more refined height separation would give us more insight on the change of optical properties with transport time and transport height.

The absolute time the dust layers spent in these different height levels is presented in figure 12. We also tested the effect of relative time in relation to total transport time but could not find a clear pattern. We find a maximum value of 0.3 for $\delta_p$ at 532 nm. On average, the depolarization decreases with increasing residence time over China. However, this dependence differs with respect to the height above ground of dust layers. The change of the depolarization ratio of dust layers travelling above 3 km above ground seems less dependent on the residence time over a given area.

We believe that short residence times (fast transport to Korea, 20 hours or less) reduces the chances that pollution may mix with dust, particularly if dust travelled below 3 km above ground. In contrast, longer residence times (slow transport to Korea, >50 hours) of the dust plumes may have increased the chances that pollution mixed with dust if dust travelled below 3 km height above ground.

Regarding $A_\beta$ we find a maximum value of 1.75 which decreases to 0.5 for slow transport of the plumes. The decrease of $A_\beta$ with transport time seems to be correlated for plumes that mainly stay below 3 km height above ground. In contrast, if plumes were above 3 km, $A_\beta$ does not seem to change with transport time. In that case, the mixing of pollution with dust may have been less likely because of the fast transport.
With regard to $S$ at 355 nm and 532 nm we find a maximum value of approximately 75 sr which drops to approximately 40 sr for slow transport. Again, we see that for plumes below 3 km height above ground transport time seems to matter. $S$ drops with increasing transport time. For the case of plumes above 3 km, i.e. dust that likely is not too much affected by mixing with anthropogenic pollution, the lidar ratios do not seem to depend on transport time. This result may however again be caused by the fact that transport times to Korea are comparably short.

We further investigated these results. We initially assumed that $\bar{A}_\beta$ either should increase with transport time or does not drop significantly for pollution that travels near the ground as there should be a higher share of small anthropogenic pollution particles in the dust plume (large particles). This opposite behaviour may be caused by the state of mixing, i.e., pollution particles attach to the dust particles, thus increasing their mean size. Hygroscopic growth of particles attached to dust may further contribute to the increase of mean size. One point that complicates this interpretation is that $\bar{A}_\beta$ does not only depend on particle size but also on particle shape and the real and imaginary part (scattering and absorption) of the particles.

With regard to $S$ we also expected that $S$ would increase with increasing transport times. If the particles travel at low height above ground more anthropogenic pollution should mix with dust. The decrease of $S$ however suggests an increase of particle size and a decrease of the light-absorption capacity. Hygroscopic particle growth, i.e. increase of mean particle size and decrease of light-absorption by uptake of water might be responsible for this behavior.

We stress that other reasons may be responsible for these results. We have a comparably small set of observations. We have insufficient information whether the plumes consisted of internal and/or external mixtures. The shape and size of particles of mixed Asian
dust might be influenced in a much more significant way by transport time. The kind of mixing between the dust particles and pollution particles could influence the light-absorption properties.

4. Summary and Conclusion

In this study we presented the differences of optical properties of mixed Asian dust layers in dependence of their vertical position over China during transport from the Chinese dust source regions to Korea. The data cover the time frame from 2009-2013. The dust layers are divided into several categories which can be characterized by different heights above ground during transport. The change of height above ground during transport of the dust layers was identified by backward trajectory analysis.

The optical properties of Asian dust significantly change in dependence of the dust plumes, the vertical position, and the change of vertical position above ground level during transport over China. We find lower values of the lidar ratios at 355 and 532 nm, lower backscatter-related Ångström exponents (wavelength pair 355/532 nm), and higher linear particle depolarization ratios at 532 nm for Asian dust that was transported at high altitudes (> 3km height above ground) compared to the situation in which the dust plumes moved at low altitudes across China. The mean linear particle depolarization ratio is 0.21±0.06 for transport at high altitudes. The mean lidar ratios in that case are 52±7 sr and 53±8 sr at 355 nm and 532 nm, respectively. The mean Ångström exponent is 0.74±0.31. These values likely reflect properties of dust little affected by anthropogenic pollution. However, we cannot quantify the amount of anthropogenic pollution that may still be present in these dust layers.

In contrast, higher values of the lidar ratios and the backscatter-related Ångström exponents, and lower values of the linear particle depolarization were found for dust layers that crossed highly polluted regions in China at low altitudes. The value of the mean linear particle
The depolarization ratio is 0.13±0.04. The mean lidar ratios are 63±9 sr and 62±8 sr at 355 nm and 532 nm, respectively. The mean backscatter-related Ångström exponent is 0.98±0.35. These values more likely describe strong influence by anthropogenic pollution, i.e. the uptake of urban pollution by dust may have been significant.

Our results suggest that the transport pathway as well as the vertical position of Asian dust during long-range transport may have significant impact on the optical properties of mixed Asian dust layers.

Acknowledgements

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References


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Yi, B., Yang, P., and Baum, B. A.: Impact of pollution on the optical properties of trans-Pacific East Asian dust from satellite and ground-based measurements, J. Geophys.
Table captions

Table 1. Linear particle depolarization ratio at 532 nm, lidar ratios, and backscatter-related Ångström exponents of Asian dust layers for different levels of anthropogenic pollution emissions.

Table 2. Summary of the linear particle depolarization ratio at 532 nm, the lidar ratio, and the backscatter Ångström exponents of Asian dust layers for Case I, i.e., Asian dust layers passed over China at high altitude (> 3km) before they arrived over Gwangju, and Case II, i.e., Asian dust layers were transported at low altitude (< 3km) over industrialized areas before they arrived over Gwangju.

Table 3. Summary of the linear particle depolarization ratio at 532 nm, the lidar ratios, and the backscatter Ångström exponents of Asian dust layers that passed over China at high altitude (above 3km) and low altitude (below 3km) when the level of pollution emission in China is lower (LP) and higher (MP), respectively.

Table 4. Linear particle depolarization ratio at 532 nm, lidar ratios, and backscatter-related Ångström exponents of East Asian dust layers according to altitude range in which these plumes passed over polluted regions of China. Case I describes the layer from 3-4km and above 4km. Case II describes the layers from 0-1km, from 1-2km, and from 2-3km height above ground.
Figure captions

Figure 1. Map of the desert regions (Taklimakan desert, Gobi desert, Badain Jaran desert, Ordos Desert, Inner Mongolia plateau, and Manchuria) and loess regions (Loess Plateau and Manchuria). The location of some major cities (Beijing and Shanghai) and industrialized areas of China (Hebei, Shandong, Henan, and Zhejiang province) is also shown. MRS.LEA is located in Gwangju, Korea.

Figure 2. Measurement on 22 April 2012, 13:15-14:05 UTC. Shown are (a) the time-height cross section of the range-corrected signal and (b) the volume depolarization ratio at 532 nm. Also shown are the profiles of (c) the volume depolarization ratio and the linear particle depolarization ratio at 532 nm, and (d) the lidar ratio at 355 and 532 nm and the backscatter-related Ångström exponents.

Figure 3. Frequency distributions of optical properties of Asian dust observed between 2009 and 2013. Shown are (a,b) lidar ratios at 355 and 532 nm, (c) linear particle depolarization ratios at 532 nm, and (d) Ångström exponents for the wavelength pair 355/532 nm. The numbers in each plot indicate the mean value and its standard deviation, the median (shown in brackets), and the minimum and maximum value of each distribution. (e) Transport pathways of all Asian dust layers and (f) the vertical position of all Asian dust layers when they passed over industrialized/populated regions of China observed between 2009 and 2013. The HYSPLIT backward trajectories were calculated for 120 hours transport time.

Figure 4. Distribution of AOD at 550 nm over East Asia retrieved from ECMWF for (a) and (e) dust, (b) and (f) organic matter, (c) and (g) black carbon, and (d) and (h) sulphate aerosol. (a) - (d) refers to 8 March 2013. That day is classified as a relatively “low polluted” day over East China. (e) - (h) refers to 10 April 2011 which is classified as a comparably “highly polluted” day over East China.

Figure 5. Scatter diagram of the linear particle depolarization at 532 nm versus (a), (d) the backscatter-related Ångström exponent (355/532 nm wavelength pair), (b), (e) the lidar ratio at 355 nm and (c), (f) the lidar ratio at 532 nm. The left column (a-c) shows the optical properties of Asian dust layers considered as less polluted (LP), the right column (d-f) shows the more polluted cases.

Figure 6. (top panel) Transport pattern of the dust plumes that originated in the desert regions and passed over industrialized/populated regions of China before arrival over the Korean peninsula. (middle panel) Vertical position of the dust layers during transport: (a) Dust layers passed over China at high altitude (Case I) (b) dust layers were transported over China through the near surface/lower troposphere (Case II). (bottom panel) Scatter diagram of the linear particle depolarization at 532 nm versus (c) the backscatter-related Ångström exponent (355/532 nm wavelength pair), and the (d), (e) lidar ratio (at 355 nm and at 532 nm) with respect to Case I and Case II. The two categories I, II are denoted by different colors. Case I is indicated by red circles. Case II is indicated by black circles.

Figure 7. Frequency distribution of dust layers that passed over China at high altitude (Case I) and dust layers that were transported over China through the near surface/lower troposphere (Case II). Shown are the linear particle depolarization ratio at 532 nm (a), the backscatter-related Ångström exponent (355/532 nm wavelength pair) (b), the lidar ratio at 355 nm (c), and the lidar ratio at 532 nm (d) for each cluster. Numbers in the plot indicate mean, median, standard deviation, and total range of the respective distributions.

Figure 8. Scatter diagram of the linear particle depolarization at 532 nm versus (a), (d) the
backscatter-related Ångström exponent (355/532 nm wavelength pair), (b), (e) the lidar ratio at 355 nm and (c), (f) the lidar ratio at 532 nm. The left column (a-c) shows the optical properties of Asian dust layers considered as less polluted (LP), the right column (d-f) shows the more polluted cases. The Asian dust layers that passed over polluted regions in China at low altitude are denoted by black circles. The Asian dust layers transported at high altitude are denoted by red squares.

Figure 9. Frequency distribution of Asian dust layers (LP for less polluted and MP for more polluted cases) in dependence of their altitude above ground (above 3km and below 3km when they passed over polluted regions in China). We show the results for the linear particle depolarization ratio at 532 nm (a), the backscatter-related Ångström exponent (355/532 nm wavelength pair) (b), the lidar ratio at 355 nm (c), and the lidar ratio at 532 nm (d) for each clusters. The numbers in the plot indicate mean, median, standard deviation, and total range of the respective distributions.

Figure 10. (top panel) (a) transport path and classification of East Asian dust layers with respect to (b) their altitude above ground when they passed over industrial regions of China. (bottom panel) transport path and corresponding altitude of Asian dust layers are distinguished by color. (black: 0 km – 1 km; green: 1 km – 2 km; purple: 2 km – 3 km; blue: 3 km – 4 km; red: above 4 km). Scatter plots of the linear particle depolarization at 532 nm (dark yellow), the backscatter-related Ångström exponent (355/532 nm wavelength pair, red), the lidar ratio at 355 nm (blue), the lidar ratio at 532 nm (green) in dependence of the 5 altitude categories (c). The height of the Asian dust layers above ground is separated by vertical lines. Case I included the layers from 3 – 4 km and above 4 km. Case II includes the layers from 0 - 1 km, from 1-2km, and from 2-3km height above ground.

Figure 11. Frequency distribution of Asian dust layers with respect to altitude above ground when they passed over industrial regions of China. We show the linear particle depolarization ratio at 532 nm (a), the backscatter-related Ångström exponent (355/532 nm wavelength pair) (b), the lidar ratio at 355 nm (c), and the lidar ratio at 532 nm (d) for each clusters. Numbers in the plot indicate mean, median, standard deviation, and total range of the respective distributions.

Figure 12. Scatter diagram of optical dust properties versus the time the Asian dust layers travelled over polluted regions in China. Shown are (a) the particle depolarization ratio, (b) the backscatter-related Ångström exponent (355/532 nm wavelength pair), (c) the lidar ratio at 355 nm, and (d) the lidar ratio at 532 nm with respect to their altitude above ground when they passed over industrial regions of China. The meaning of the colors and symbols is the same as in figure 10.
<table>
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<th>Vertical position at pollution regions</th>
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<td>532 nm</td>
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<td>53±8</td>
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<td>62±8</td>
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<table>
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<th>Number of observed layers</th>
<th>Linear particle depolarization ratio</th>
<th>Lidar ratios (sr)</th>
<th>Ångström exponent</th>
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</thead>
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<td></td>
<td></td>
<td>355nm</td>
<td>532nm</td>
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<tr>
<td>LP_below 3km</td>
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<td>64±9</td>
<td>62±8</td>
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<td>MP_below 3km</td>
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<td></td>
<td>Below 1km</td>
<td>10</td>
<td>0.12±0.01</td>
<td>63±7</td>
</tr>
</tbody>
</table>
[7]

(a) Particle depolarization ratio:
- CASE I: 0.20±0.06 (0.21)
- CASE II: 0.09-0.33, 0.13±0.04 (0.13), 0.08-0.23

(b) AE - BSC related 355/532 pair:
- CASE I: 0.74±0.31 (0.71)
- CASE II: 0.38-1.56, 0.98±0.35 (0.97), 0.40-1.71

(c) Lidar ratio at 355 nm [sr]:
- CASE I: 53±8 (53)
- CASE II: 38-68, 63±10 (62), 44-83

(d) Lidar ratio at 532 nm [sr]:
- CASE I: 53±9 (52)
- CASE II: 41-67, 62±8 (64), 48-73
Particle depolarization ratio

(a) AE - BSC related

(b) LR at 532 nm [sr]

(c) LR at 355 nm [sr]

(d) AE - BSC related

(e) LR at 355 nm [sr]

(f) LR at 532 nm [sr]
[10]