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Trends and sources of ozone and sub-micron aerosols at the Mt. Bachelor Observatory (MBO) during 2004–2015



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HIGHLIGHTS

• Long-range transport and UTLS enhance tropospheric O₃ in western US in spring.

• Interannual aerosol increase in summer is driven by regional and Siberian wildfires.

• CO emission rate helps identify long-range transport wildfire and industrial events.

• Enhancement ratios and aerosol optical properties provide plume event signatures.

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ABSTRACT

In this paper, we report the climatology of tropospheric ozone (O₃) and sub-micron aerosol scattering at the Mt. Bachelor Observatory (MBO, 2.8 km asl) in central Oregon, USA, during 2004–2015. The seasonal cycle for O₃ showed a bimodal pattern with peaks in April and July, while aerosol scattering (σ_{sp}) was lognormally distributed with a very high peak in August and a smaller peak in May. The mean O₃ concentrations showed positive and significant trends in all seasons except winter, with a slope of 0.6 –0.8 ppbv yr⁻¹. Monthly criteria for isolating free tropospheric (FT) and boundary layer influenced (BLI) air masses at MBO were obtained based on comparison of MBO water vapor (WV) distributions to those of Salem (SLE) and Medford (MFR), Oregon, at equivalent pressure level. In all seasons, FT O₃ was, on average, higher than BLI O₃, but the seasonal patterns were rather similar. For σ_{sp} the FT mean in spring was higher, but the BLI mean in summer was significantly higher, indicating the importance of regional wildfire smoke.

To better understand the causes for the seasonal and interannual trends at MBO, we identified four major categories of air masses that impact O₃, carbon monoxide (CO) and aerosols: upper troposphere and lower stratosphere (UTLS) O₃ intrusion, Asian long-range transport (ALRT), Arctic air pollution (AAP) and plumes from the Pacific Northwest region (PNW). ALRT and PNW plumes can be further divided into wildfires (WF), industrial pollution (IP) and mineral dust (MD). Over the 12 years of observations, 177 individual plume events have been identified. Enhancement ratios (ERs) and Ångström exponents (AEs) of aerosols were calculated for all events. The lowest slope of $\Delta \sigma_{sp}/\Delta O_3$ is a unique feature of UTLS events. PNW-WF events have the highest averages for $\Delta \sigma_{sp}/\Delta CO$, $\Delta \sigma_{sp}/\Delta O_3$ and $\Delta \sigma_{sp}/\Delta NO_y$ compared to other events. ALRT-WF events have lower absorption AEs (\tilde{A}_{ap}) than PNW-WF, implying that brown carbon (BrC) is generated from biomass burning but its fraction decreases during long-range transport. Signatures of ERs and AEs are useful tools to identify different plume categories. These results demonstrate the increasing impact of baseline O₃ on US air quality due to both global sources and regional wildfire events.

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1. Introduction

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http://dx.doi.org/10.1016/j.atmosenv.2017.06.042 1352-2310/© 2017 Elsevier Ltd. All rights reserved. Tropospheric ozone (O_3) and airborne particles (aerosols), especially fine particulate matter ($PM_{2.5}$ or PM_1), have significant



impacts on human health and the environment (Davidson et al., 2005). O₃ plays an important role in atmospheric chemistry and the global climate (IPCC, 2014). Sulfate and other low absorption aerosols have a dominant cooling effect and partially offset warming due to aerosol absorption and greenhouse gases (GHGs) (Charlson et al., 1992; Buseck and Pósfai, 1999; IPCC, 2014). There are at least four sources of tropospheric O_3 and aerosols in the western US: upper troposphere and lower stratosphere (UTLS) intrusion, Asian long-range transport (ALRT), Arctic air pollution (AAP) and plumes from the Pacific Northwest region (PNW). In the western US, background sources of O₃ and PM are more important compared to other parts of the US (Jaffe et al., 1999; Heald et al., 2006; Zhang et al., 2009; McDonald-Buller et al., 2011). ALRT can be broadly classified into three categories: biomass burning, mineral dust and industrial pollution (Fischer et al., 2010a; Ambrose et al., 2011).

In the troposphere, O_3 comes from secondary photochemical processes involving nitrogen oxides (NO_x), carbon monoxide (CO) and volatile organic compounds (VOCs) plus intrusion of stratospheric air. A significant increase in springtime O_3 mixing ratios in the western North America has been observed by Cooper et al. (2010) with evidence that it is influenced by increasing precursor emissions from Asia. Lin et al. (2012) argued that much of the recent O_3 increase was driven by variability in circulation. Among the Asian sources of O_3 , Siberian wildfires could also be an important contributor (Gratz et al., 2015). UTLS intrusions have also been linked to high- O_3 events in the western US, especially in springtime (Ambrose et al., 2011; Langford et al., 2012, 2017; Lin et al., 2012). Regional wildfires in the western US also contribute significantly to summertime O_3 enhancement (Pfister et al., 2006; Jaffe et al., 2008, 2013; Baylon et al., 2015).

Aerosol optical properties, including scattering (σ_{sp}) and absorption (σ_{ap}) , are useful indicators for source identification. The wavelength dependence of σ_{sp} is parameterized using the scattering Ångström exponent $(Å_{sp})$, defined as follows (Ångström, 1929):

$$\sigma_{sp} = \lambda^{-A_{sp}} \tag{1}$$

Because the coefficient σ_{sp} decreases with wavelength for smaller aerosol particles, \hat{A}_{sp} will be larger for smaller particle distributions (Boren and Huffman, 1983). In a similar way, \hat{A}_{ap} is the absorption Ångström exponent which is related to the composition, shape and mixing state of the aerosol particles, leading to size variation as well (Bergstrom et al., 2007):

$$\sigma_{ap} = \lambda^{-\dot{A}_{ap}} \tag{2}$$

Optical coefficients (σ_{sp} and σ_{ap}) together with their wavelength dependences ($Å_{sp}$ and $Å_{ap}$) reflect the differences of diverse aerosol plumes, especially between dust aerosols and combustion-generated carbonaceous aerosols (Fialho et al., 2005; Clarke et al., 2007; Yang et al., 2009; Fischer et al., 2011; Cappa et al., 2012; Cazorla et al., 2013).

The slope of a regression curve between two pollutants is known as the enhancement ratio (ER), which is an important tool for plume source apportionment. The ER of an air pollutant, such as O_3 , NO_x and peroxyacetyl nitrate (PAN), normalized to CO is often used to identify and characterize the production or loss of the pollutant in smoke plumes, especially wildfire plumes (Goode et al., 2000; Bertschi et al., 2004; Honrath et al., 2004; Bertschi and Jaffe, 2005; Pfister et al., 2006; Val Martin et al., 2006; Real et al., 2007; Paris et al., 2009; Alvarado et al., 2010; Fischer et al., 2010b; Singh et al., 2010; Wigder et al., 2013). This method accounts for air mass dilution given the simple and well understood processing of CO. Jaffe and Wigder (2012) summarized reported $\Delta O_3/\Delta CO$ values for wildfire plumes arranged by biome type and by plume age and found that the average $\Delta O_3/\Delta CO$ ratio increases with plume age and also that tropical regions tend to have significantly greater ratios compared to boreal and temperate regions. However, they also reported large variability in $\Delta O_3/\Delta CO$ ratios. Wigder et al. (2013) focused on the $\Delta PM_1/\Delta CO$ ratio in wildfire plume events and found evidence for secondary organic aerosol (SOA) production in wildfire plumes. However, they found that with longer transport time PM₁ loss is greater than SOA production. Baylon et al. (2015) looked into wildfire plume events and calculated multiple ERs, including $\Delta \sigma_{sp}/\Delta CO$, $\Delta O_3/\Delta CO$, $\Delta NO_y/\Delta CO$, $\Delta NO_x/\Delta O_y$ and $\Delta PAN/\Delta NO_y$. The correlation between $\Delta O_3/\Delta CO$ and $\Delta NO_x/$ ΔNO_y implies that the degree of NO_x oxidation is a key predictor of O₃ production.

In this study, we report on seasonal variations and interannual trends of O_3 and sub-micron aerosols at the Mt. Bachelor Observatory (MBO) in central Oregon, USA, for 2004–2015. MBO has one of the longest, continuous records of free tropospheric measurements in North America. Over the 12 years of observations, 177 individual plume events were identified based on elevated σ_{sp} , O_3 or CO. The purpose of this study is to identify background sources of O_3 and aerosols in the western US and characterize each category by a series of signatures including enhancement ratios and aerosol optical properties. We recognize that many plumes have multiple sources associated with them (Cooper et al., 2004), but we can identify the major contributors through gridded emissions for fires and industrial pollution, combined with air mass backward trajectories.

2. Methodology

2.1. Site description and measurements of air pollutants

Mt. Bachelor Observatory (MBO) is located on the summit of a dormant volcano in central Oregon (43°58'39" N 121°41'10" W. 2 763 m asl). Due to its elevation and distance from major US source regions, local pollution is relatively rare at MBO. Mixing ratios of O_3 and CO, scattering coefficient of sub-micron aerosols and meteorological parameters (e.g., air temperature, pressure, relative humidity, wind speed and direction, water vapor) have been measured from 2004 to 2015. Mixing ratios of nitrogen oxides (NO_x and NO_v), PAN and mercury as well as sub-micron aerosol scattering and absorption coefficients at multiple wavelengths have been measured during specific campaigns. Detailed instrumentation with method detection limits (MDLs) and estimated total uncertainties (Weiss-Penzias et al., 2006; Fischer et al., 2010a, 2010b; Virkkula, 2010; Ambrose et al., 2011; Fischer et al., 2011; Chen et al., 2013; Baylon et al., 2015; Gratz et al., 2015; Briggs et al., 2016) is described in Table S1 in the Supporting Information (SI).

Both aerosol scattering coefficient (σ_{sp}) and absorption coefficient (σ_{ap}) are reported at ambient temperature and pressure conditions. With σ_{sp} at 450 and 700 nm and σ_{ap} at 467 and 660 nm, dimensionless intensive optical properties, including scattering Ångström exponent ($Å_{sp}$) and absorption Ångström exponent ($Å_{ap}$), can be calculated as follows:

$$\mathring{A}_{sp} = -\frac{\ln\left(\sigma_{sp}^{450} \middle/ \sigma_{sp}^{700}\right)}{\ln(450/700)}$$
(3)

$$\mathring{A}_{ap} = -\frac{\ln\left(\sigma_{ap}^{467} / \sigma_{ap}^{660}\right)}{\ln(467/660)} \tag{4}$$

The coefficients at blue and red wavelengths were utilized in the

calculation of the intensive properties, whereas we use the scattering coefficients at green wavelength to calculate plume enhancements and enhancement ratios with other pollutants.

2.2. Sounding data analysis

Twice daily (0 and 12 UTC) meteorological sounding data were obtained from the National Weather Service (http://weather.uwyo. edu/upperair/sounding.html) to quantify the vertical distribution of water vapor (WV) concentrations. This was used to help identify free tropospheric (FT) and boundary layer influenced (BLI) air masses at MBO. Soundings from Medford, Oregon (MFR, 42.36° N, 122.86° W, 405 m asl), and Salem, Oregon (SLE, 44.91° N, 123.00° W, 61 m asl), were used to compare with the monthly MBO WV distributions at equivalent pressure level (720–740 mbar). We have used similar techniques previously but at a seasonal resolution (Weiss-Penzias et al., 2006; Fischer et al., 2010b; Ambrose et al., 2011).

Ozonesonde data from Trinidad Head, California (THD, 41.05° N, 124.15° W, 107 m asl), during 2004–2015 were obtained from the Earth System Research Laboratory (ESRL) of NOAA (http://www.esrl.noaa.gov/gmd/ozwv/ozsondes). The THD ozonesonde data are collected in the daytime (16:00–22:00 UTC, or 8:00–14:00 local time).

2.3. Backward trajectory analysis

We computed 240-h air mass backward trajectories from MBO for every hour of identified plume events using the Hybrid Single-Particle Lagrangian Integrated Trajectory (HYSPLIT) model version 4 (Draxler and Hess, 1998). For 2004 we used meteorological data from the Eta Data Assimilation System (EDAS) (40 km × 40 km) and the Final Global Data Assimilation System (FNL) (191 km × 191 km), and for 2005–2015 we used Global Data Assimilation System (GDAS) $1^{\circ} \times 1^{\circ}$ gridded meteorological data. The starting height was set to be 1800 m above ground level based on terrain height in the $1^{\circ} \times 1^{\circ}$ gridded meteorological data.

2.4. Wildfire maps and gridded industrial CO emission inventories

Daily MODIS fire detection data for North America was obtained from the United States Department of Agriculture (USDA) Forest Service (http://activefiremaps.fs.fed.us/gisdata.php). Daily MODIS fire detection data for Eurasia was downloaded from the Fire Information for Resource Management System (FIRMS) of the US National Aeronautics and Space Administration (NASA) (https:// firms.modaps.eosdis.nasa.gov/download). Gridded maps (0.1° × 0.1°) of global industrial CO emissions for the year 2010 were obtained from the Task Force on the Hemispheric Transport of Air Pollution (HTAP) (http://www.htap.org).

2.5. Enhancement ratio analysis

For each plume event, we performed correlation analyses among gaseous pollutants (including O₃, CO, PAN, NO_x and NO_y) and σ_{sp} . Enhancement ratios were calculated by taking the slope ($\Delta Y/\Delta X$) from the reduced major axis (RMA) regression between X and Y (Baylon et al., 2015).

3. Results and discussion

- 3.1. Climatology of tropospheric O₃
- 3.1.1. Seasonal variation of the O_3 mixing ratio
 - Using the 12-year database (2004-2015), we present the

20 1 2 3 4 5 6 7 8 9 10 11 12 Month Fig. 1. Statistical distributions of the O₃ mixing ratio at the Mt. Bachelor Observatory (MBO) by month. The bottom and top of the box represent the 25th and 75th percentiles (the lower and upper quartiles, q1 and q3), respectively. The band near the middle of the box represents the 50th percentile (the median). The dot near the middle of the box represents the mean. The ends of the whiskers represent $q_{3+1.5(q_3-q_1)}$

and q1-1.5(q3-q1), respectively. The dots are outliers.

seasonal variation of the O₃ mixing ratio at MBO. Fig. 1 shows the distribution of O₃ mixing ratios by month. A bimodal pattern with peaks in April and July was found, which reveals the influence of ALRT, UTLS and regional wildfires in spring and summer. The monthly average O₃ mixing ratio had the highest value (50.4 ppbv) in April and the lowest (40.5 ppbv) in November. O₃ at MBO was highest in the springtime, which was influenced by both ALRT and UTLS intrusion (Weiss-Penzias et al., 2006; Cooper et al., 2010; Ambrose et al., 2011; Lin et al., 2012; Gratz et al., 2015). Enhancements in summertime O₃ at MBO were mainly from regional wildfires in the western US (Jaffe et al., 2013; Wigder et al., 2013; Baylon et al., 2015) and UTLS intrusion in early summer, although Siberian fire plumes also contribute occasionally (Ambrose et al., 2011). The contribution of each source is further discussed in Section 3.4.

3.1.2. Trends and interannual variation of the O₃ mixing ratio

Fig. 2 shows the interannual variation of O₃ by season from 2004 to 2015. From 2004 to 2015, the mean O₃ mixing ratio in spring, summer and fall increased by 0.62 \pm 0.25 ppbv yr⁻¹ ($r^2 = 0.38$, p < 0.05), 0.66 ± 0.27 ppbv yr⁻¹ ($r^2 = 0.38$, p < 0.05) and 0.79 ± 0.34 ppbv yr⁻¹ ($r^2 = 0.35$, p < 0.05), respectively. This trend appears to be driven by Asian pollution in spring (Ambrose et al., 2011) and regional wildfires in summer and early fall (Jaffe et al., 2013; Wigder et al., 2013; Baylon et al., 2015). However, the slopes of the trend should be interpreted with caution given that 2004 has a low O₃ level and 2015 has a high O₃ level (Jaffe and Zhang, 2017). The trends in the three seasons were not significant (p > 0.05) for the period of 2005–2014 in contrast to the trends for the entire data record from 2004 to 2015. The springtime O₃ increase was probably linked to the increase of Asian emissions (Gratz et al., 2015). The yearly 98th percentile of O_3 at MBO, reflecting the design value, had a more significant positive trend than the median (see Fig. S1 in the SI). Lin et al. (2015) summarized previous O₃ observations from sondes, lidars and aircraft campaigns in the western US during 1995-2014 and showed a significant positive trend. However, the trend significantly slowed after 2005. Interannual variations are also very important. Significant jumps of the average O3 mixing ratio were found in the summer of 2012 and 2015. The 2012 jump was probably related to the more frequent wildfire events as indicated by higher mean CO and





Fig. 2. Trends and interannual variations of the O₃ mixing ratio by season. The points show the mean values and the bars show the standard deviations.

aerosols at MBO. It is further verified by source identification in Section 3.4. The 2015 jump was probably linked to summer wild-fires and the temperature anomaly in the western US in 2015, especially June (Jaffe and Zhang, 2017).

3.2. Climatology of sub-micron aerosol scattering

3.2.1. Seasonal variation of the aerosol scattering coefficient

Fig. 3 displays the distribution of aerosol scattering coefficient (σ_{sp} , green) by month in logarithmic scale. Sub-micron σ_{sp} also has a bimodal seasonal pattern. The highest peak occurred in August followed by a smaller peak in May. Summer plume events had a more significant influence on sub-micron aerosols than spring plume events. The highest value in August was about three orders of magnitude higher than the median value. The springtime aerosols are mainly from ALRT, including biomass burning, mineral dust and industrial pollution (Fischer et al., 2010a, 2011), while summertime aerosols are mostly generated from regional and Siberian wildfires (Wigder et al., 2013; Laing et al., 2016). In summer, primary aerosols from regional wildfires have more significant impacts on MBO than aerosols from long-range transport, although Siberian wildfires are also important (Laing et al., 2016).

3.2.2. Interannual variation of the aerosol scattering coefficient Fig. 4 shows the interannual variation of sub-micron aerosol



Fig. 3. Statistical distributions of the sub-micron aerosol scattering coefficient at the Mt. Bachelor Observatory (MBO). The bottom and top of the box represent the 25th and 75th percentiles (the lower and upper quartiles, q1 and q3), respectively. The band near the middle of the box represents the 50th percentile (the median). The dot near the top of the box represents the mean. The ends of the whiskers represent q3+1.5(q3-q1) and q1-1.5(q3-q1), respectively. The dots are outliers.

scattering coefficient by season from 2004 to 2015. For aerosol scattering, we saw an increase only in summer but not statistically



Fig. 4. Interannual variation of the aerosol scattering coefficient by season. The points show the mean values and the bars show the standard deviations.

significant ($r^2 = 0.32$, p = 0.06). This could be driven by recent increases in wildfire activity in the western US (Jaffe et al., 2013; Wigder et al., 2013; Baylon et al., 2015). The level of aerosol scattering in summer 2015 was exceptionally high because of the frequent and large wildfire events (Laing et al., 2016).

3.3. Free tropospheric O_3 and aerosols

3.3.1. Criteria for FT and BLI air masses at MBO

At MBO daily upslope and downslope airflows cause a pronounced diurnal variation in O₃, WV, CO₂ and other pollutants (McClure et al., 2016). We used the 2010–2015 sounding data from both MFR and SLE to obtain monthly distributions of the WV concentration at the 720–740 mbar level, which is similar to the MBO pressure. This pressure level at MFR and SLE represent FT air masses as indicated by the lack of diurnal WV variability (Weiss-Penzias et al., 2006; Ambrose et al., 2011). Hourly WV data from MBO at the same period were also processed for monthly distributions. The significant diurnal change of WV suggests an influence of planetary boundary layer (PBL) on the air at MBO in daytime (Reidmiller et al., 2010; McClure et al., 2016).

A FT dataset for MBO was defined by the monthly distribution of all WV data at 720–740 mbar from the MFR and SLE soundings. We obtained a similar WV distribution from MBO by retaining the drier portion of the distribution such that the monthly averages of the MBO data and the soundings were equivalent. The cut points are referred to as the WV criteria for FT air masses at MBO, as shown in Table 1. The retained data represent FT air masses, while the nonretained data stand for BLI air masses. The BLI air is not purely boundary layer or FT air but represents a mix of the two. MBO is influenced constantly by FT air and occasionally by daytime upslope flow to the summit from the more moist PBL air (McClure et al., 2016). The seasonal variation of the criteria is similar to our previous study (Ambrose et al., 2011). However with a monthly resolution rather than seasonal, this study contributes to a more accurate FT/BLI isolation.

3.3.2. Free tropospheric O₃

Based on the WV criteria, the O₃ mixing ratios for FT and BLI were separated and the monthly averages of each are shown in Fig. 5. There is a significant difference (5–10 ppbv) between the average O₃ mixing ratios for FT and BLI at MBO. The FT O₃ had a peak in May unlike the BLI case, but the variations and trends for FT and BLI O₃ were similar. The most significant discrepancies occurred in May and June, reflecting the influence of ALRT and UTLS O₃ intrusion. We compared seasonal tropospheric O₃ between MBO and THD (see Fig. 5). THD tropospheric O₃ has a bimodal seasonal pattern, 2–8 ppbv higher than MBO. The highest average THD O₃ mixing ratios occur in April. The significant peak of THD O₃ in August suggests a more significant impact of regional industrial pollution and/or wildfires compared to MBO. The difference between THD and MBO could be caused by large-scale transport and

Table 1

Water vapor (WV) criteria for free tropospheric/boundary layer influenced (FT/BLI) air masses at MBO and average FT and BLI WV by month. The WV criteria are the cut-off values that make the MBO mean WV similar to the radiosonde data.

	Jan	Feb	Mar	Apr	May	Jun	Jul	Aug	Sep	Oct	Nov	Dec
WV Criteria(g kg ⁻¹)	3.26	2.64	2.46	2.55	3.06	4.25	5.14	5.23	4.60	4.36	3.44	2.97
Average FTWV (g kg $^{-1}$)	2.07	1.76	1.85	1.98	2.30	2.94	3.36	3.66	3.05	2.75	2.20	1.96
Average BLIWV (g kg ⁻¹)	3.99	3.46	3.41	3.65	4.45	5.58	6.58	6.41	5.72	5.28	4.42	3.82



Fig. 5. Means of the O₃ mixing ratio for MBO free tropospheric air (MBO-FT), MBO boundary layer influenced air (MBO-BLI), MBO overall (MBO) and Trinidad Head (THD) at 720–740 mbar.

local photochemical condition instead of PBL influence. Fig. S2 in the SI shows the climatology of vertical velocity at 700 mbar in the US. THD exhibits a positive overall vertical velocity while MBO has a negative one. Pacific high pressure and subsidence in northern California increase O_3 at THD (Stauffer et al., 2017), while the mean negative vertical velocity indicates greater upward airflow with high WV at MBO.

3.3.3. Free tropospheric aerosols

With the WV criteria, sub-micron aerosol scattering coefficients for FT and BLI were also separated, and the monthly average σ_{sp} is shown in Fig. 6. The mean FT σ_{sp} was higher in spring, but the mean BLI σ_{sp} was significantly higher in summer. This implies that the regional wildfire smoke (at lower elevation) in summer had more influence on the BLI atmosphere while global sources had more impacts on the FT air masses in the rest of the year. The bimodal pattern was more prominent for the FT air masses than BLI air masses due to springtime ALRT in the free troposphere. The contribution of summertime Siberian wildfires to FT aerosols is non-negligible. Laing et al. (2016) reported that 6 of 19 biomass burning events at MBO during August 2015 were influenced by Siberian fires originating near Lake Baikal. The next section provides more evidence on the contribution of Siberian wildfires in summer.

3.4. Plume event identification

To verify the pollution sources that cause the seasonal patterns and interannual trends of O_3 and σ_{sp} , we identified plume events using hourly data of σ_{sp} , O_3 or CO that are above the 97.5 percentile of the annual dataset. The identified hours are called "polluted hours". A group of no less than eight consecutive polluted hours, plus two hours before and two hours after, was identified as a



Fig. 6. Means of the sub-micron aerosol scattering coefficient for free tropospheric (FT) air, boundary layer influenced (BLI) air and overall at MBO.

plume event (i.e., one event is at least 12 h long). We referred to the pollutants that are enhanced for each event as the trigger pollutants. Based on these criteria, a total of 177 plume events were identified during 2004–2015. It should be noted that most plumes have multiple sources.

Based on backward trajectories and correlation between WV and O₃, plume events at MBO can be broadly classified into four categories: upper troposphere and lower stratosphere (UTLS) O₃ intrusion, Asian long-range transport (ALRT), Arctic air pollution (AAP), and plumes from Pacific Northwest (PNW). UTLS events have trajectories derived from higher elevation (5 000-10 000 m agl). ALRT events have longer trajectories, often tracing back to Siberia, Mongolia, China or Japan. AAP events have trajectories passing through the Arctic at lower elevations. PNW events have shorter trajectories that originate from the Pacific Northwest region at low elevation. Fig. 7a exhibits the WV-O3 relationships for the THD sounding data (1997–2017). WV and O3 are overall negatively correlated. The negative slope of $\Delta O_3/\Delta WV$ is steeper at higher elevations. MBO data showed a similar pattern as the THD data (Fig. 7b) which can be used for source identification. UTLS and ALRT events originate from higher elevations, and thus have higher O₃ and lower WV with steeper $\Delta O_3/\Delta WV$ slopes. The WV concentrations of these two categories are usually lower than 3 g kg⁻¹, while those of PNW events are usually higher than 4 g kg⁻¹. UTLS and ALRT frequently occur together and are difficult to separate because ALRT air masses often climb up and back down over the Pacific Ocean entraining UTLS air masses. Besides backward trajectories, we used the CO level to make a rough separation. When the mean CO is in the range of 110–130 ppbv, it is considered as a mixture of UTLS and ALRT. CO level below this range implies the dominant contribution of UTLS while above this range ALRT. In either case, it is difficult to separate source of O₃ for an air parcel transported at high elevations.

ALRT and PNW events can be further categorized into wildfires (WF), industrial pollution (IP) and mineral dust (MD). Backward



Fig. 7. Water vapor-ozone (WV-O₃) relationships for (a) the Trinidad Head (THD) sounding data (1997–2017) at different elevations, and (b) different categories of events at MBO (2004–2015), including upper troposphere and lower stratosphere O₃ intrusion (UTLS), Asian long-range transport events (ALRT), the combination of UTLS and ALRT, Arctic air pollution events (AAP), and Pacific Northwest pollution events (PNW).

trajectories, wildfire detection maps from MODIS and gridded industrial CO emission inventories from HTAP were used for identifying these sub-categories. For ALRT events, an air mass may pass through fire spots, an industry-intensive region (e.g., China, Japan) or a desert region (e.g., Mongolia) at low elevation (<3 000 m agl). This would carry the air pollution from all of these sources. ALRT events are usually mixed events, but we can identify which is the major contributor among WF, IP and MD. ALRT-MD has elevated σ_{sp} but low CO. However, it is much more difficult to distinguish ALRT-WF from ALRT-IP. To identify the dominant source, we estimate the CO emission rates of WF and IP in the grid boxes through which the trajectories pass to determine their relative contribution.

The backward trajectories from MBO back to East Asia have uncertainties of up to 1 000 km (Draxler and Hess, 1998). Therefore, we partitioned the East Asia region into $10^{\circ} \times 10^{\circ}$ grids and identify those grids where the air mass passes through at low altitude (<3 000 m agl) as "influential grids". Based on the industrial CO emission inventory in 2010 from HTAP, we calculated the average CO emission rate of each grid. Fig. S3 in the SI shows the industrial CO emission rates of all grids in East Asia. The grid containing the North China Plain region (Beijing, Tianjin, Hebei, etc.) has the highest industrial emission rate (1 024 kg CO s⁻¹). Wildfire maps for

the East Asia region seven days (average transport time) before each event were obtained from the MODIS data. We calculated the CO emission rate from wildfires for each fire spot based on the fire radiative power (FRP) using the following equation adopted from Kaiser et al. (2012):

$$r = \kappa_l \cdot \beta_l \cdot \text{FRP} \tag{5}$$

where *r* is the emission rate of CO, g CO s⁻¹; κ_l is the emission factor of CO that is land cover type dependent, g CO kg⁻¹ (dry matter); β_l is the conversion factor that is also land cover type dependent, kg (dry matter) MJ⁻¹; FRP is the fire radiative power from the MODIS dataset, MW; *l* is the land cover type, including extratropical forest (EF), tropical forest (TF), savannah (SA), agriculture (AG), and so on. κ_l and β_l are from the study of Kaiser et al. (2012), and land cover information is from the MODIS data by Global Land Cover Facility (http://glcf.umd.edu/data/lc).

CO emission rates for each grid were obtained by adding up emission rates of all fire spots in the grid. We used the ratio of wildfire/industrial (W/I) CO emission rates in the influential grids to quantify the largest source. Fig. 8 shows the CO emission rates and W/I ratios of an ALRT-WF event and an ALRT-IP event. If the W/I ratio of an ALRT event is higher than 2, it is regarded as an ALRT-WF event; if lower than 0.5, it is regarded as an ALRT-IP event; and if the W/I ratio is in the range of 0.5–2, it is considered a mixing event (ALRT-WF/IP). Most events with influential grids in Siberia are ALRT-WF events, while most events with influential grids in China are ALRT-IP events.

Most PNW events are PNW-WF with a high slope of $\Delta \sigma_{sp}/\Delta CO$. Air masses of PNW-IP events usually occur when regional wildfires are absent and the air mass circulates in an industry-intensive area with a long residence time in the western US at low elevation (<1 000 m agl). Air masses of PNW-MD events are from the desert areas in the southwestern US with elevated σ_{sp} but low CO. PNW-IP and PNW-MD are rare events at MBO.

Fig. 9 shows the distribution of different types of plume events during 2004–2015 by month. UTLS events occur most frequently in spring and early summer. ALRT events have the highest frequency in spring with a few in summer, mainly Siberian wildfire events. PNW events mainly occur in summer and early fall.

3.5. Characteristics of typical plume events

Table S2 in the SI shows a summary of all 177 plume events. Six typical plume events were chosen as examples for UTLS, ALRT-WF, ALRT-IP, ALRT-MD, PNW-WF, and PNW-IP. Backward trajectories of these events are shown in Fig. 10. WV-O₃ and CO- σ_{sp} relations of these events are shown in Figs. S4–S9 in the SI. Means and maximum values of hourly σ_{sp} , O₃, CO, NO_x, PAN, NO_y and WV of these events are shown in Table 2.

3.5.1. Event 138: 21 July 2013 (UTLS)

Event 138 occurred at 4:00–20:00 UTC on July 21, 2013. In this event, O₃ was the only elevated compound, while CO and σ_{sp} were both at very low levels. O₃ was negatively correlated with WV (R² = 0.84). This event had the lowest hourly average of WV (1.20 g kg⁻¹) among the six events. The trajectories came from a very high altitude above the Pacific Ocean (Fig. 10a). Fig. S10 in SI shows the geopotential height at 850 mbar from the National Centers for Environmental Prediction (NCEP) Reanalysis for the East Pacific and North America region on 15 July 2013. We observe the confrontation of high and low pressure zones above the East Pacific region, which is the primary driving force of UTLS intrusion.



Fig. 8. Gridded East Asian carbon monoxide (CO) emission rates and HYSPLIT trajectories of (a) an Asian long-range transport wildfire (ALRT-WF) event (Event 36, 9 May 2006) and (b) an Asian long-range transport industrial pollution (ALRT-IP) event (Event 148, 20–21 November 2013). Shaded grids are influential grids where trajectories are at low altitude (<3 000 m agl); the numbers above and below the line in shaded grids are CO emission rates of wildfire and industry, respectively (unit: kg s⁻¹); The W/I ratio is the ratio of wildfire/ industrial CO emissions.



Fig. 9. Distribution of different types of plume events during 2004–2015 by month. (PNW: Pacific Northwest pollution; IP: industrial pollution; WF: wildfire; MD: mineral dust; AAP: Arctic air pollution; ALRT: Asian long-range transport; UTLS: upper troposphere and lower stratosphere O_3 intrusion).

3.5.2. Event 151: 19 April 2014 (ALRT-WF)

Event 151 occurred between 2:00–18:00 UTC on April 19, 2014. The average σ_{sp} rose up to a maximum hourly average of 39.7 Mm⁻¹, and CO and O₃ elevated to high levels. There were significant positive correlations between σ_{sp} and CO (R² = 0.93) and between σ_{sp} and O₃ (R² = 0.45). The hourly average WV (2.45 g kg⁻¹) was lower than regional events. Air mass trajectories traveled at low elevation through an intensive wildfire region at the eastern junction of Siberia and China on April 11–13 (Fig. 10b). Fig. S11 in the SI shows the CALIPSO lidar vertical profiles one day before arrival at the western US on April 19. Polluted dust and cloud were observed in the profiles. The W/I ratio of this event was 5.28.

3.5.3. Event 148: 20-21 November 2013 (ALRT-IP)

Event 148 took place in 2013 from 21:00 on November 20 to 11:00 on November 21 (UTC). CO and σ_{sp} were enhanced in the plume. O₃ was at a low level. There were significant positive correlations between σ_{sp} and CO (R² = 0.91) and between O₃ and CO (R² = 0.30). The trajectories traveled at low elevation through northern China which was an industry-intensive region (Fig. 10c). This path avoided wildfire intensive regions and carried with it heavy industrial pollution. The CALIPSO profiles show the arrival of this event in the western US on November 21 (Fig. S12 in SI). ALRT-IP air masses frequently experience cloud processing during transport, which will reduce the amount of aerosols but not the CO. The W/I ratio of this event was 0.06.

3.5.4. Event 102: 1 May 2011 (ALRT-MD)

Event 102 occurred at 3:00–15:00 UTC on May 1, 2011. The σ_{sp} and O₃ levels were both elevated, but CO remained low. This is typical for ALRT-MD events, which are often mixed with UTLS air. Positive correlation between O₃ and σ_{sp} was observed (R² = 0.54). Trajectories traveled at low elevation through the Gobi Desert region in South Mongolia and North China, carrying a significant amount of mineral dust (Fig. 10d). Fig. S13 in the SI shows the CALIPSO profiles at the arrival section in the western US on May 1, and the profiles corroborate the presence of mineral dust.

3.5.5. Event 123: 25-26 August 2012 (PNW-WF)

Event 123 took place in 2012 from 11:00 on August 25 to 22:00 on August 26 (UTC). Extremely high maximum hourly values of σ_{sp} (407 Mm⁻¹) and CO (707 ppbv) were found in this event with a very strong correlation (R² = 0.97). NO_x and NO_y were also enhanced significantly to maximum hourly values (577 and 4 648 pptv, respectively). Fig. 10e shows the local trajectories in the western US.



Fig. 10. Backward trajectories for six typical plume events at MBO: (a) an upper troposphere and lower stratosphere O₃ intrusion (UTLS) event; (b) an Asian long-range transport wildfire (ALRT-WF) event; (c) an Asian long-range transport industrial pollution (ALRT-IP) event; (d) an Asian long-range transport mineral dust (ALRT-MD) event; (e) a Pacific Northwest wildfire (PNW-WF) event; (f) a Pacific Northwest industrial pollution (PNW-IP) event.

Table 2
Means and maximum values of hourly air pollutant concentrations for six typical plume events.

Event No.	Event time	Category ^a	σ_{sp} (M	$m^{-1})$	O ₃ (pp	bv)	CO (pp	bv)	NO _x (p	ptv)	PAN (p	ptv)	NO _y (p	ptv)	WV (g	kg^{-1})
			Mean	Max	Mean	Max	Mean	Max	Mean	Max	Mean	Max	Mean	Max	Mean	Max
138	2013/7/21 4:00-20:00	UTLS	0.9	1.8	74.3	86.3	84	94	148	171	50	69	_	_	1.20	1.97
151	2014/4/19 2:00-18:00	ALRT-WF	26.4	39.7	67.1	79.9	192	226	_	_	_	_	_	_	2.45	3.44
148	2013/11/20 21:00-2013/11/21 11:00	ALRT-IP	16.6	28.6	53.3	57.0	215	260	_	_	_	-	-	-	1.53	2.04
102	2011/5/1 3:00-15:00	ALRT-MD	4.8	6.0	70.0	77.5	129	134	_	_	_	_	_	_	1.73	3.53
123	2012/8/25 11:00-2012/8/26 22:00	PNW-WF	100.6	406.7	60.7	69.4	296	707	283	577	_	_	1 418	4 648	4.62	5.59
53	2007/5/25 7:00-18:00	PNW-IP	3.0	4.3	64.0	76.5	124	130	85	133	_	-	_	-	3.52	5.29

^a UTLS: upper troposphere and lower stratosphere O₃ intrusion; ALRT: Asian long-range transport; PNW: Pacific Northwest pollution; WF: wildfires; IP: industrial pollution; MD: mineral dust.

Low-altitude trajectories traveled through two hotspots of wildfires with high FRP values in northern California on August 25–26.

3.5.6. Event 53: 25 May 2007 (PNW-IP)

Event 53 occurred at 7:00–18:00 UTC on May 25, 2007. In this event, O_3 was enhanced with an hourly average of 64.0 ppbv while CO was not (an hourly average of 124 ppbv). Trajectories circulated at low altitude above the Pacific Ocean and traveled through western Oregon to MBO without impact of wildfires (Fig. 10f). WV was also greater than the FT cutoff value. Urban pollution from industries and mobile sources in the Portland-Eugene-Springfield metropolitan area and coastal areas were probably the major contributors. Trajectories for this event were originated from subtropical latitudes where background O_3 is lower, indicating the contribution from local sources.

3.6. Signatures of different event categories

Table 3 shows the mean enhancement ratios (ERs) and the aerosol Ångström exponents of different event types. These are important signatures for source identification. PNW-MD events have little data available and are thus not listed in Table 3.

3.6.1. UTLS

UTLS events have steep negative $\Delta O_3/\Delta WV$ slopes $(-10.05 \pm 3.26 \text{ ppbv kg g}^{-1})$, which reveals that an anomalously low WV level is usually linked to a strong O_3 intrusion. UTLS and UTLS/ALRT events also have the only negative average $\Delta \sigma_{sp}/\Delta O_3$ among all event types. The $\Delta O_3/\Delta CO$ slope varies significantly among different UTLS events. UTLS events have higher $\Delta NO_{x}/\Delta PAN$ ($0.96 \pm 0.64 \text{ pptv pptv}^{-1}$) than PNW-WF events. However, due to limited available data, this comparison should be interpreted with caution. The high A_{sp} in UTLS events should be interpreted with caution as well given the extremely low scattering coefficients.

3.6.2. ALRT-WF

ALRT-WF events have the highest $\Delta O_3/\Delta CO$ among all event types (0.52 ± 0.64 ppbv ppbv⁻¹), which is caused by the large amount of O₃ precursors generated from wildfires and the long transport time for secondary O₃ generation. ALRT-WF and ALRT-WF/IP events have lower \dot{A}_{ap} levels (1.45 ± 0.02 and 1.54 ± 0.39) than PNW-WF events (1.81 ± 0.59), which implies that brown carbon (BrC) is generated from the biomass burning process but its fraction decreases during the long-range transport due to photobleaching (Laing et al., 2016). O₃ from Siberian wildfires can be an important influence on US surface air quality (Jaffe, 2004).

3.6.3. ALRT-IP

ALRT-IP events have lower а $\Delta \sigma_{sp} / \Delta CO$ $(0.20 \pm 0.18 \text{ Mm}^{-1} \text{ ppbv}^{-1})$ than ALRT-WF, due to the high level of CO in industrial pollution. The $\Delta O_3/\Delta CO$ slope of ALRT-IP events $(0.21 \pm 0.50 \text{ ppbv ppbv}^{-1})$ is higher than PNW-WF but lower than ALRT-WF. The long-range transport gives ALRT-IP events sufficient time for O₃ generation. ALRT-IP events have a less steep negative $\Delta O_3/\Delta WV$ (-7.88 ± 6.26 ppbv kg g⁻¹) than other ALRT events, because ALRT-IP events are usually linked to cloud process during transport resulting in higher WV. ALRT-IP events have the lowest average A_{sp} (2.02 \pm 0.20) among all types of events, indicating relatively larger particle size. This is possibly due to mixing with mineral dust sources during long-range transport.

3.6.4. ALRT-MD

ALRT-MD events are usually associated with UTLS. Mineral dust plumes occur in drier air masses (lower WV), and the $\Delta O_3/$

Fable 3 Enhancement 1	atios (mean :	\pm standard deviation) and \hat{a}	aerosol Ångström expc	ments of different types	of plume events base	d on hourly data at M	BO.			
Category ^a	Trigger pollutants	$\Delta O_{3}/\Delta WV(ppbv~kg~g^{-1})$	$\Delta \sigma_{sp} / \Delta CO(Mm^{-1})$ ppbv $^{-1}$)	$\Delta\sigma_{sp}/\Delta O_3({ m Mm}^{-1})$ ppbv $^{-1})$	$\Delta \sigma_{sp}/\Delta NO_y (Mm^{-1})$ pptv ⁻¹)	ΔO ₃ /ΔCO(ppbv ppbv ⁻¹)	ΔNO _y /ΔCO(pptv ppbv ⁻¹)	$\Delta NO_x/\Delta PAN(pptv pptv^{-1})$	Å _{sp}	Åap
UTLS	03	$-10.05 \pm 3.26(23/23)^{b}$	$0.17 \pm 0.12(9/19)$	$-0.14 \pm 0.12(12/23)$	0.04(1/3)	$0.04 \pm 1.53 (4/19)$	$10.08 \pm 1.80(2/3)$	$0.96 \pm 0.64(4/5)$	$2.66 \pm 0.88(10)$	(0)
UTLS/ALRT	03	$-11.06 \pm 5.01(20/20)$	$0.32 \pm 0.36(9/18)$	$-0.07 \pm 0.20(5/18)$	0.01(1/5)	$0.17 \pm 3.17(5/20)$	$-0.10 \pm 9.52(2/6)$	0.68(1/2)	$2.15 \pm 0.18(9)$	$0.91 \pm 0.74(4)$
ALRT-WF	σ_{sp} , CO	$-10.53 \pm 3.85(10/11)$	$0.42 \pm 0.20(4/9)$	$0.48 \pm 0.71(5/11)$	(0/4)	$0.52 \pm 0.64(7/9)$	$-5.67 \pm 21.38(3/3)$	(0/0)	$2.19 \pm 0.16(4)$	$1.45 \pm 0.02(2)$
ALRT-WF/IP	σ_{sp} , CO	$-10.61 \pm 3.66(6/9)$	$0.23 \pm 0.13(3/8)$	$0.66 \pm 0.51(5/8)$	$0.05 \pm 0.03(2/5)$	$0.01 \pm 0.90(3/9)$	$8.14 \pm 6.90(4/5)$	(0/1)	$2.23 \pm 0.30(4)$	$1.54 \pm 0.39(4)$
ALRT-IP	CO	$-7.88 \pm 6.26(15/22)$	$0.20 \pm 0.18(11/17)$	$0.51 \pm 0.86(9/18)$	-0.12(1/5)	$0.21 \pm 0.50(13/21)$	7.69(1/4)	(0/0)	$2.02 \pm 0.20(6)$	(0)
ALRT-MD	σ_{sp}	$-13.94 \pm 6.81(3/3)$	-0.33(1/3)	$0.18 \pm 0.01(2/3)$	(0/0)	$-1.19 \pm 0.60(3/3)$	(0/0)	(0/1)	$2.07 \pm 0.05(2)$	(0)
AAP	CO	$-5.85 \pm 3.40(6/6)$	$0.13 \pm 0.15(4/6)$	$1.39 \pm 2.40(2/6)$	$0.05 \pm 0.04(2/5)$	$-0.28 \pm 0.60(3/6)$	$2.72 \pm 0.26(2/5)$	(0/0)	(0)	(0)
PNW-WF	σ_{sp} , CO	$-5.27 \pm 5.99(42/73)$	$0.59 \pm 0.17(58/63)$	$10.98 \pm 13.16(30/70)$	$0.10 \pm 0.07(19/25)$	$0.10 \pm 0.12(20/61)$	$5.83 \pm 3.11(19/25)$	$0.35 \pm 0.25(6/11)$	$2.16 \pm 0.20(33)$	$1.81 \pm 0.59(5)$
PNW-IP	0	$-8.57 \pm 0.68(2/3)$	(0/1)	1.92(1/3)	(0/0)	(0/1)	(0/0)	(0/0)	2.25(1)	1.86(1)
^a UTLS: uppe ^b The first va	er tropospher lue in parent	e and lower stratosphere O theses gives the count of av	¹ 3 intrusion; ALRT: Asi ailable data (ΔY/ΔX) w	an long-range transport; vith considerable correla	: AAP: Arctic air pollu tion between X and Y	tion; PNW: Pacific No ' ($\mathbb{R}^2 \ge 0.3$), and the se	rthwest pollution; WF: cond number gives the	wildfires; IP: indus e count of total avai	trial pollution; MD lable data (ΔY/ΔX).	: mineral dust.

 Δ WV of ALRT-MD is thus steeper (-13.94 ± 6.81 ppbv kg g⁻¹). In recent years, ALRT-MD events are rare compared to large MD events that occurred in prior years (Husar et al., 2001; Jaffe et al., 2003).

3.6.5. AAP

The average $\Delta \sigma_{sp}/\Delta CO$ of AAP (0.13 ± 0.15 Mm⁻¹ ppbv⁻¹) is lower than ALRT-IP. Arctic pollution reservoir originates mainly from industrial pollution. One signature of AAP events is the high CO level and low oxidant level, resulting in low $\Delta O_3/\Delta CO$ (-0.28 ± 0.60 ppbv ppbv⁻¹) and low $\Delta NO_y/\Delta CO$ (2.72 ± 0.26 pptv ppbv⁻¹). However, the number of events is limited to make a conclusive statement.

3.6.6. PNW-WF

PNW-WF events have the highest $\Delta \sigma_{sp}/\Delta CO$, $\Delta \sigma_{sp}/\Delta O_3$ and $\Delta \sigma_{sp}/\Delta NO_y$ among all types of events (0.59 ± 0.17 Mm⁻¹ ppbv⁻¹, 10.98 ± 13.16 Mm⁻¹ ppbv⁻¹ and 0.10 ± 0.07 Mm⁻¹ pptv⁻¹, respectively). This is a distinctive feature of PNW-WF events, where aerosol is a dominant pollutant and has a shorter residence time than the gaseous pollutants (CO, O₃ and NO_y) (Laing et al., 2016). PNW-WF events have a lower level of $\Delta O_3/\Delta CO$ (0.10 ± 0.12 ppbv ppbv⁻¹) than ALRT-WF events, indicating secondary O₃ formation during long-range transport and consistent with greater O₃ production after extended transport (Jaffe and Wigder, 2012).

3.6.7. PNW-IP

Because MBO is near to the coast and has no large cities upwind, PNW-IP events at MBO are relatively rare. These have a steeper negative $\Delta O_3/\Delta WV$ slope (-8.57 ± 0.68 ppbv kg g⁻¹) than PNW-WF events, demonstrating a stronger inverse relation likely associated with BLI/FT exchange.

4. Conclusions

Mixing ratios of O_3 , CO, NO_x , NO_y and PAN and the optical properties of sub-micron aerosols have been measured at MBO from 2004 to 2015. The monthly average O_3 distribution has a bimodal pattern with peaks in April and July. ALRT and UTLS events were the main contributors of O_3 in the western US in spring, while regional wildfires and UTLS contributed the most in summer with a non-negligible contribution from Siberian wildfires. Regional wildfires had more significant impacts on σ_{sp} , resulting in a very high peak in summer especially August. A smaller peak of σ_{sp} is seen in May, likely due to ALRT. Between 2004 and 2015, the mean O_3 mixing ratio in spring, summer and fall increased by 0.6-0.8 ppbv yr⁻¹ driven by Asian pollution in spring and regional wildfires in summer and early fall.

We used the 2010–2015 sounding WV data from MFR and SLE at equivalent pressure level with MBO to separate FT and BLI air masses at MBO. At MBO, O₃ is significantly higher (5–10 ppbv) in FT air compared to BLI air. The BLI mean σ_{sp} was higher than the FT mean in summer while lower in other seasons, showing that the regional air pollution in summer had more influence on the BLI atmosphere. O₃ at MBO is slightly lower than an equivalent alternative (THD) over northern California due to the large-scale synoptic patterns. The bimodal pattern of σ_{sp} was more prominent for the FT air masses than BLI air masses due to springtime ALRT in the free troposphere.

Over the 12 years of observations, we identified 177 individual plume events. These can be broadly classified into four categories (UTLS, ALRT, AAP and PNW) based on backward trajectories and the WV-O₃ relationship. ALRT and PNW can be further divided into WF, IP and MD based on the CO level and the W/I ratio. Six typical plume events were described in detail. Enhancement ratios and Ångström

exponents, regarded as signatures of different event categories, were calculated. UTLS events have the lowest $\Delta \sigma_{sp}/\Delta O_3$ slope. PNW-WF events have the highest $\Delta \sigma_{sp}/\Delta CO$, $\Delta \sigma_{sp}/\Delta O_3$ and $\Delta \sigma_{sp}/\Delta NO_y$ among all types of events. The lower averages of ALRT-WF events indicate the sub-micron aerosol has a shorter residence time than the gaseous pollutants. The comparison of $Å_{ap}$ between PNW-WF and ALRT-WF implies that BrC is generated from biomass burning, but its fraction decreases during the long-range transport, likely due to photobleaching.

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Appendix A. Supplementary data

Supplementary data related to this article can be found at http://dx.doi.org/10.1016/j.atmosenv.2017.06.042.

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