



1	Aerosol Responses to Precipitation Along North American Air Trajectories Arriving at
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Abstract

North American pollution outflow is ubiquitous over the western North Atlantic Ocean, especially in winter, making this location an ideal natural laboratory for investigating the impact of precipitation on aerosol particles along air mass trajectories. We take advantage of observational data collected at Bermuda to seasonally assess the sensitivity of aerosol mass concentrations and volume size distributions to accumulated precipitation along trajectories (APT). The mass concentration of particulate matter with aerodynamic diameter less than 2.5 µm normalized by the enhancement of carbon monoxide above background (PM2.5/ΔCO) at Bermuda was used to estimate the degree of aerosol loss during transport to Bermuda. Results for December-February (DJF) show most trajectories come from North America and have the highest APTs, resulting in significant reduction (by 53%) in PM_{2.5}/ Δ CO under high APT conditions (> 13.5 mm) relative to low APT conditions (< 0.9 mm). Moreover, PM_{2.5}/ Δ CO was most sensitive to increases in APT up to 5 mm (-0.044 μg m⁻³ ppbv⁻¹ mm⁻¹) and less sensitive to increases in APT over 5 mm. While anthropogenic PM2.5 constituents (e.g., black carbon, sulfate, organic carbon) decrease with high APT, sea salt in contrast was comparable between high and low APT conditions owing to enhanced local wind and salt emissions in high APT conditions. The greater sensitivity of the fine mode volume concentrations (versus coarse mode) to wet scavenging is evident from AERONET volume size distribution data. A combination of GEOS-Chem model simulations of ²¹⁰Pb submicron aerosol tracer and its gaseous precursor ²²²Rn reveal that (i) surface aerosol particles at Bermuda are most impacted by wet scavenging in winter/spring (due to large-scale precipitation) with a maximum in March, whereas convective scavenging plays a substantial role in summer; and (ii) North American ²²²Rn tracer emissions contribute most to surface ²¹⁰Pb concentrations at Bermuda in winter (~75-80%), indicating that air masses arriving at Bermuda experience largescale precipitation scavenging while traveling from North America. A case study flight from the ACTIVATE field campaign on 22 February 2020 reveals a significant reduction in aerosol number and volume concentrations during air mass transport off the U.S. East Coast associated with increased cloud fraction and precipitation. These results highlight the sensitivity of remote marine boundary layer aerosol characteristics to precipitation along trajectories, especially when the air mass source is continental outflow from polluted regions like the U.S. East Coast.





1. Introduction

Aerosol properties are difficult to characterize in remote marine regions owing to the scarcity of monitoring stations as compared to over land. Island observatories are critical resources to investigate long-range transport of aerosol particles and their associated properties (e.g., Silva et al., 2020). The western North Atlantic Ocean (WNAO) includes the island of Bermuda, which has a rich history of monitoring data for both surface and columnar aerosol characteristics, thus affording the opportunity to study how aerosol properties are impacted by different sources and processes along the transport of air masses to the site. Consequently, Bermuda has been the subject of decades of intense atmospheric science research (Sorooshian et al., 2020), especially as it is a receptor site for both North African dust (Chen and Duce, 1983) and anthropogenic outflow from both North America (Arimoto et al., 1992; Galloway et al., 1989; Moody et al., 2014; Corral et al., 2021) and Europe (Anderson et al., 1996; Cutter, 1993). North American outflow reaching Bermuda has been linked to appreciable levels of anthropogenic species (e.g., sulfate, lead, elemental carbon, ozone) (Wolff et al., 1986), more acidic rainfall as compared to other air mass sources (Jickells et al., 1982), and a significant reduction of sulfate levels in both aerosol and wet deposition samples in response to reduced SO₂ emissions in recent decades (Keene et al., 2014).

There have been extensive studies reporting on some aspect of air mass history prior to arrival at Bermuda (Sorooshian et al., 2020 and references therein), including predominant circulation patterns impacting Bermuda at different times of the year (e.g., Miller and Harris, 1985; Veron et al., 1992). What remains uncertain is how precipitation along those trajectories impacts surface aerosol characteristics at Bermuda. Wet scavenging rates are very difficult to constrain over open ocean areas such as the WNAO (Kadko and Prospero, 2011). Arimoto et al. (1999) used aerosol radionuclide data in relation to airflow pattern information to conclude that pollutant transport to Bermuda is common from the northwest and that precipitation scavenging can be influential; their analysis of rain effects on nuclide activities were based on rain data collected at Bermuda without knowledge of rain along trajectory pathways. While many studies have investigated how composition at Bermuda varies based on air mass trajectories, the subject of how precipitation along those trajectories impact the resultant aerosol at Bermuda has not been adequately addressed but is motivated by past works (Moody and Galloway, 1988; Todd et al., 2003).

In their recent aerosol climatology study for Bermuda, Aldhaif et al. (2021) found the peculiar result that fine particulate pollution in the winter months (December-February) was reduced even though there was an enhanced number density of air mass back trajectories traced back to North America. They hypothesized that enhanced seasonal cloud fractions and precipitation in winter (Painemal et al., 2021) contribute to the removal of aerosol particles during transport via wet scavenging, which we aim to study more deeply here using a variety of datasets. Results of this study have broad relevance to all remote marine regions impacted by transported continental pollution, in addition to advancing knowledge of how precipitation can impact surface aerosol characteristics.

2. Datasets and Methods

Datasets used in this work are summarized in Table 1 and described in brief detail below.





Table 1. Summary of datasets used in this work. Data are between 1 January 2015 and 31 December 2019, with the exception of ACTIVATE aircraft data based on a single flight day on 22 February 2020. GEOS-Chem simulations are separately described in Section 2.5. Section 2 provides more details about the datasets used in this study, including specific instruments from the ACTIVATE airborne dataset.

Parameter	Acronym	Data Source	Time Resolution	Website
Particulate matter mass concentration (aerodynamic diameter less than 2.5 µm)	PM _{2.5}	Fort Prospect Station	Hourly	https://doi.org/10.6084/m9.figshare.13651454.v2
Particulate matter mass concentration (aerodynamic diameter less than 10 µm)	PM_{10}	Fort Prospect Station	Daily	https://doi.org/10.6084/m9.figshare.13651454.v2
Nitrogen monoxide concentration	NO	Fort Prospect Station	Hourly	https://doi.org/10.6084/m9.figshare.13651454.v2
Nitrogen dioxide concentration	NO ₂	Fort Prospect Station	Hourly	https://doi.org/10.6084/m9.figshare.13651454.v2
Nitrogen oxide concentration	NO_X	Fort Prospect Station	Hourly	https://doi.org/10.6084/m9.figshare.13651454.v2
Volume size distribution	VSD	AERONET	Hourly	https://aeronet.gsfc.nasa.gov/
Carbon monoxide surface concentration	CO	MERRA-2	Hourly	https://disc.gsfc.nasa.gov/
Aerosol speciated surface mass concentrations	-	MERRA-2	Hourly	https://disc.gsfc.nasa.gov/
Surface wind speed	WindsF	MERRA-2	Hourly	https://disc.gsfc.nasa.gov/
Planetary boundary layer height	PBLH	MERRA-2	Hourly	https://disc.gsfc.nasa.gov/
Back-trajectory	-	HYSPLIT	N/A	https://www.ready.noaa.gov/HYSPLIT.php
Precipitation	APT/Rain	GDAS	Hourly	https://www.ready.noaa.gov/archives.php
Aerosol/cloud properties	-	Airborne: ACTIVATE	1 – 45 Sec	https://doi.org/10.5067/SUBORBITAL/ACTIVATE/DATA001

2.1 Bermuda Surface Measurements

 Aerosol and gas measurements were conducted at Fort Prospect in Bermuda (32.30° N, 64.77°W, 63 m ASL). Hourly PM_{2.5} data were collected with a Thermo Scientific TEOM 1400a Ambient Particulate Monitor with 8500C FDMS (Federal Equivalent Method EQPM-0609-181 for PM_{2.5}). Concentrations were determined by employing conditioned filter sample collection and direct mass measurements using an inertial micro-balance (TEOM 1400a). Hourly precision was \pm 1.5 $\mu g \, m^{\text{-}3}$. Hourly data were averaged every 6 hours to match the time frequency of the trajectory analysis discussed subsequently.

 PM₁₀ concentrations were determined based on U.S. Environmental Protection Agency (EPA) method IO-2 (EPA, 1999) using a Tisch model TE6070 hi-volume air sampler, equipped with 8" × 10" TissuQuartz 2500 QAT-UP quartz fiber filters. The PM₁₀ sampler was operated at a flow rate of 2.1 m³ min⁻¹ yielding a total volume of 3000 m³ over a 24 hr sampling period. The sampler flow rate was calibrated every 3 months. Sampling was synchronized with the 1-in-6 day national ambient air quality schedule used by EPA. Prior to deployment, the filters were equilibrated for 24 hr in an environmental control chamber maintaining constant conditions of relative humidity (35 ± 2%) and temperature (21 ± 2°C). The filters were then weighed with a precision of ± 0.1 mg using a Mettler Toledo AB104 balance, which was modified for weighing unfolded 8" × 10" filters, and then transferred to clean re-sealable plastic bags for transportation to the field site. After sampling, the exposed filters were returned immediately to the laboratory where they were re-equilibrated in the environmental control chamber for 24 hr before being re-weighed





to determine the particle loading from which particle concentrations were calculated. PM_{10} determinations have an accuracy of within \pm 2.5%, which is equivalent to \pm 0.2 μg m⁻³ based on the average of $PM_{2.5}$ between 2015 and 2019 (i.e., 6.7 μg m⁻³).

Various gases were monitored with hourly time resolution using a Model T200U Trace-level NO/NO₂/NO_x analyzer (Teledyne API), which is a U.S. EPA compliance analyzer relying on a proven chemiluminescence principle. The gas analyzer was routinely calibrated using NIST-certified calibrant NO₂ in ultra-high purity nitrogen (Airgas, Inc., Radnor Township, PA, USA). Acceptable criteria applied for single point quality control (QC) allows for $\pm 15.1\%$ or $< \pm 1.5$ ppb difference, whichever is greater (40 CFR Part 58 App A Sec. 3.1.1). Similar to PM_{2.5}, these hourly gas data were averaged to 6-hour resolution.

Columnar aerosol data were obtained from a NASA AErosol RObotic NETwork (AERONET) (Holben et al., 1998) surface station at Tudor Hill (32.264° N, 64.879° W). Level 2 daily data have been quality assured and cloud screened based on the Version 3 algorithm (Giles et al., 2019). We focus on the volume size distribution (VSD) product that has 22 logarithmically equidistant discrete radii ranging from 0.05 to 15 μ m. A radius of 0.6 μ m typically discriminates between fine and coarse modes when using AERONET data (Dubovik et al., 2002; Schuster et al., 2006).

2.2 Reanalysis Data

Modern-Era Retrospective analysis for Research and Applications-Version 2 (MERRA-2) (Gelaro et al., 2017) products were used as a data source for speciated aerosol and gas parameters including surface mass concentration of sea-salt (collection "tavg1_2d_aer_Nx") and surface concentration of carbon monoxide (CO; collection "tavg1_2d_chm_Nx"). Surface wind speed and planetary boundary layer height (PBLH) (collection "tavg1_2d_flx_Nx") data were also obtained from MERRA-2. Hourly and 3-hourly data were downloaded and averaged for a 0.5° latitude by 0.625° longitude grid (i.e., 32° – 32.5°N and 64.375° – 65°W) surrounding Bermuda and subsequently converted to 6-hour data to match the time frequency of trajectory analysis results.

2.3 Air Mass Trajectory Analysis

To track air mass pathways arriving at Bermuda (32.30° N, 64.77°W), we obtained 10-day (240 hr) back-trajectories from the Hybrid Single-Particle Lagrangian Integrated Trajectory model (HYSPLIT) (Stein et al., 2015; Rolph et al., 2017). We used an ending altitude of 100 m (AGL) to be within the surface layer and close to the measurement site. As discussed later, sensitivity analysis with higher ending altitudes (500 m and 1 km; Figs. S1-S2) reveal similar results to using 100 m. Four trajectories were initialized (i.e., 6-hour interval) each day between 1 January 2015 00:00:00 UTC and 31 December 2019 18:00:00 UTC resulting in a total of 7304 individual trajectories. Trajectories were calculated using the Global Data Assimilation System (GDAS) one-degree archive data and with the "model vertical velocity" method, which is a way that vertical motion is handled in HYSPLIT for trajectory calculations. Precipitation data were also obtained along the trajectories based on GDAS one-degree data. Results presented in Figs. 1-3 are based on 10-day back-trajectories, whereas analyses presented in the remaining sections of the paper are based on 4-day (96 hr) back-trajectories.

2.3.1 Concentration Weighted Trajectory Analysis and Seasonal Rain Maps

Concentration weighted trajectories (CWT) were calculated based on the 10-day back-trajectories from HYSPLIT in conjunction with Bermuda surface PM_{2.5} data described in Section





2.1. The CWT method has been implemented widely to identify long-range pollutant transport pathways impacting a receptor site (Hsu et al., 2003; Wang et al., 2009; Hilario et al., 2020). Seasonal maps of average precipitation experienced by trajectories were also estimated based on 10-day back-trajectories from HYSPLIT. The aforementioned analyses were performed for 0.5°×0.5° grids covering the area encompassed by 10°–80°N and 5°–170°W. A weight function following the method of Dimitriou et al. (2015) was applied in the CWT analysis and precipitation maps to increase statistical stability.

2.3.2 Trajectory Clustering

Hierarchical agglomerative clustering was used to identify characteristic trajectories reaching Bermuda at 100 m (AGL). Hierarchical clustering was based on the "complete linkage" method (Govender and Sivakumar, 2020). Four-day HYSPLIT back-trajectories were used to perform clustering analysis. Distances between trajectories were calculated using the Haversine formula, which calculates distance between two points on Earth assuming they are on a great circle (Sinnott, 1984). Clustering was performed for varying numbers of clusters, ranging between 2 and 32. The L-method (Kassomenos et al., 2010) was implemented to identify the optimum number of clusters. In this method, root mean square deviation (RMSD) was calculated for each clustering run and then plotted versus the number of clusters to determine the optimum solution. RMSDs were estimated based on the distances between trajectories and associated mean cluster trajectories.

2.4 Airborne Measurements

Airborne data from the Aerosol Cloud meteorology Interactions oVer the western ATlantic Experiment (ACTIVATE) are used from Research Flight 6 (RF6) on 22 February 2020. ACTIVATE involves two NASA Langley aircraft (HU-25 Falcon and UC-12 King Air) flying in coordination at different altitudes to simultaneously characterize the same vertical column with a focus on aerosol-cloud-meteorology interactions (Sorooshian et al., 2019). RF6 was a rare case of the HU-25 Falcon flying alone, but this aircraft conveniently included measurements relevant to this study. The ACTIVATE strategy involves the HU-25 Falcon flying in the boundary layer to characterize gas, aerosol, cloud, and meteorological parameters along the following level legs: Min. Alt. = lowest altitude flown (500 ft), BCB = below cloud base, ACB = above cloud base, BCT = below cloud top, ACT = above cloud top.

Data from the following instruments were used: Condensation Particle Counter (CPC; TSI Model 3772) for number concentration of particles with diameter > 10 nm; Scanning Mobility Particle Sizer (SMPS; TSI Model 3081) for aerosol size distribution data between 3.2 – 89.1 nm; Laser Aerosol Spectrometer (LAS; TSI Model 3340) for aerosol size distribution data between diameters of $0.09-5~\mu m$; two-dimensional optical array imaging probe (2DS; SPEC Inc.) (Lawson et al., 2006) for rain water content (RWC) quantified by integrating rain drop size distributions between diameters of $39.9-1464.9~\mu m$; and Fast Cloud Droplet Probe (FCDP; SPEC Inc.) (Knop et al., 2021) for cloud liquid water content (LWC) calculated by integrating drop size distributions between diameters of $3-50~\mu m$. With the exception of SMPS data (45 second resolution), all airborne data were at 1 second resolution.

2.5 Radionuclide tracers in GEOS-Chem Model

Lead-210 (²¹⁰Pb, half-life 22.3 years) is the decay daughter of ²²²Rn (half-life 3.8 days) emitted mainly from land surfaces. After production, it indiscriminately attaches to ambient



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submicron particles, which move with the air until being scavenged by precipitation or deposited to the surface. Because of its relatively well-known source and wet deposition as its principal sink, ²¹⁰Pb has long been used to test wet deposition processes in global models (e.g., Liu et al., 2001). It is also a useful tracer to describe continental air influence over oceans. In this study, we use ²¹⁰Pb as simulated by the GOES-Chem model to investigate the role of precipitation scavenging in affecting seasonal surface aerosol concentrations at Bermuda.

GEOS-Chem (http://www.geos-chem.org) is a global 3-D chemical transport model driven by meteorological fields from the Goddard Earth Observing System (GEOS) of the NASA Global Modeling and Assimilation Office (Bey et al., 2001; Eastham et al., 2014). It has been widely used to study trace gases and aerosols in the atmosphere. Here we use the model version 11-01 (http://wiki.seas.harvard.edu/geos-chem/index.php/GEOS-Chem v11-01) driven by the MERRA-2 reanalysis (at 2.5° longitude by 2° latitude resolution) to simulate ²²²Rn and ²¹⁰Pb. The model simulates the emission, transport (advection, convection, boundary layer mixing), deposition, and decay of the radionuclide tracers (Liu et al., 2001; Brattich et al., 2017; Yu et al., 2018; Zhang et al., 2021). As a function of latitude, longitude, and month, ²²²Rn emission uses a customized emission scenario that was built upon previous estimates and evaluated against global ²²²Rn surface observations and vertical profile measurements (Zhang et al., 2021). GEOS-Chem uses the TPCORE advection algorithm of Lin and Rood (1996), calculates convective transport using archived convective mass fluxes (Wu et al., 2007), and uses the non-local boundary-layer mixing scheme implemented by Lin and McElroy (2010). The wet deposition scheme follows that of Liu et al. (2001) and includes rainout (in-cloud scavenging) due to large-scale (stratiform and anvil) precipitation, scavenging in convective updrafts, and washout (below-cloud scavenging) by precipitation (Wang et al., 2011). A modification to the large-scale precipitation scavenging scheme is included to use spatiotemporally varying cloud water contents from MERRA-2 instead of a fixed constant value in the original model (Luo et al., 2019). Dry deposition is based on the resistance-in-series scheme of Wesely (1989).

3. Results and Discussion

3.1 Seasonal Profiles

3.1.1 Back-Trajectories

Our results in Fig. 1 show that the summer months (June-August, JJA) are distinct due to the Bermuda High promoting easterly winds at latitudes south of Bermuda that turn north and become southwesterly (~ parallel to U.S. East Coast) towards Bermuda. The Bermuda high pressure system and its associated anticyclonic circulation in the boundary layer have been reported to be strongest in April–September (Merrill, 1994; Moody et al., 1995). This high pressure system breaks down in other months in favor of strengthened extratropical subpolar low pressure, thus yielding more air influence from the northwest and west (Arimoto et al., 1995; Davis et al., 1997), which is clearly evident in the other three seasonal panels of Fig. 1 and most pronounced in the winter months (December-February, DJF). In their analysis of air mass history leading to rain events over Bermuda, Altieri et al. (2013) observed more influence from air originating over water in warmer months (April-September) and faster moving air masses originating over the continental U.S. primarily in the colder months of October-March. Moody and Galloway (1988) also showed that cool months (October-March) were marked by more transport from the U.S. East Coast. It can be deduced from Fig. 1 that based on the farther reaching source areas of the backtrajectories in colder months, and especially DJF, that air moves faster in the boreal winter. Finally, we note that Figs. S1-S2 show the same results as Fig. 1 but with ending altitudes of 500 m and 1





km over Bermuda; the sensitivity tests indicate the same general results and thus we continue the discussion using results based on 100 m.

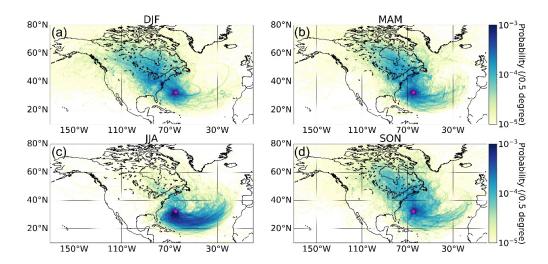


Figure 1. Seasonal maps (a-d) showing the probability density of trajectories calculated based on 10-day HYSPLIT backward trajectories reaching Bermuda (32.30° N, 64.77°W), denoted by the pink star, at 100 m (AGL). This analysis is based on trajectories between 01 January 2015 and 31 December 2019. Analogous results for ending altitudes of 500 m and 1 km are shown in Figs. S1 and S2, respectively.

3.1.2 Surface Aerosol and NO_x

Recent work has shown a seasonal cycle over Bermuda for column-integrated aerosol properties, with aerosol optical depth (AOD) being highest in March-May (MAM) and JJA and lowest in September-November (SON) and DJF (Aldhaif et al., 2021). They further showed that sea salt contributed more to AOD in the colder months (SON, DJF) whereas sulfate, organic carbon, black carbon and dust were more dominant in MAM and JJA. In their examination of aerosol type seasonality at Bermuda, Huang et al. (1999) observed that marine and crustal elements peaked in winter and summer, respectively, and that pollution-derived particles dominated in spring with a smaller peak in fall. We use Fort Prospect data to gain a revised perspective about seasonality and the weekly cycle of surface layer aerosol and additionally NO_x (box notch plots in Figs. S3a-f).

Median seasonal concentrations of PM_{2.5} (μg m⁻³) were as follows at Bermuda, being largely consistent with the AOD seasonal cycle: DJF = 5.50, MAM = 6.36, JJA = 6.11, SON = 5.33 (Fig. S3). NO_x exhibited a similar seasonal pattern (ppbv): DJF = 17.76, MAM = 21.62, JJA = 18.68, SON = 13.95 (Fig. S3). It is difficult to ascertain sources and impacts of precipitation on PM_{2.5} based on these values. As a next step we present the seasonal CWT maps showing the predominant pathways accounting for the majority of PM_{2.5} at Bermuda (Fig. 2). Expectedly, PM_{2.5} in JJA is largely accounted for by trajectories following the general anticyclonic circulation already shown in Fig. 1c associated with the Bermuda High. These air masses are enriched with African dust as has been documented in many past studies (e.g., Arimoto, 2001; Huang et al., 1999; Muhs





et al., 2012). In contrast, the other seasons (especially DJF and MAM) showed greater relative influence from North American outflow versus other source regions.

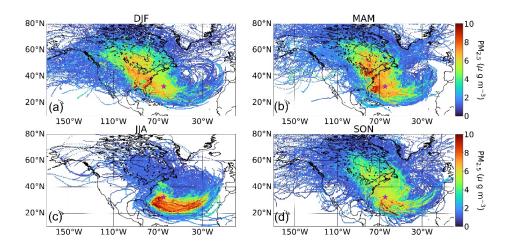


Figure 2. Seasonal (a-d) concentration-weighted trajectory maps (CWT) for $PM_{2.5}$ measured at Fort Prospect in Bermuda, denoted by the pink star. This analysis is based on trajectories between 1 January 2015 and 31 December 2019.

While we focus on long-range transport of PM_{2.5} to Bermuda, local sources cannot be ignored, including both sea salt and non-sea salt species (e.g., Galloway et al., 1988). The island has a population of approximately 64,000 as of 2016 (Government of Bermuda, 2019). Local influence from anthropogenic sources has been reported to be insignificant in contrast to transported pollution (Galloway et al., 1988; Keene et al., 2014). We assess how significant local anthropogenic sources are based on day-of-week aerosol concentrations and whether significantly higher levels exist on working days as compared to weekend days as shown in other regions with strong anthropogenic influence (Hilario et al., 2020 and references therein). Our analysis found negligible difference between working days (Monday-Friday) and weekend days (Saturday-Sunday) for both PM_{2.5} and NO_x (Figs. S3b/d), including when resolved by season (Figs. S4-S5). Therefore, it is less likely that local anthropogenic emissions dominate the island's PM_{2.5} and NO_x, providing support for transported sources being more influential; as will be shown, normalizing PM_{2.5} by CO helps control for local anthropogenic influence.

We also examined seasonal and day-of-week statistics for PM_{10} to assess the relative importance of coarse aerosol types including mainly sea salt and dust (Figs. S3e-f). Results reveal the highest median PM_{10} values ($\mu g \, m^{-3}$) in DJF (19.24), followed by MAM (18.51), JJA (17.98), and SON (15.88). As will be shown later and already documented (Aldhaif et al., 2021), surface wind speeds around Bermuda are highest in DJF, contributing to higher sea salt emissions. Expectedly there was no observable PM_{10} weekly cycle as dust and sea salt are naturally emitted. Both $PM_{2.5}$ and PM_{10} exhibited their highest seasonal standard deviations in JJA owing most likely to the episodic nature of some pollution events such as with dust and biomass burning (e.g., Aldhaif et al., 2021).



3.1.3 Precipitation Along Trajectories

Figure 3 shows seasonal profiles of average precipitation rate obtained from GDAS (Table 1) in $0.5^{\circ} \times 0.5^{\circ}$ grids based on 10-day back trajectories arriving at Bermuda (100 m AGL). The spatiotemporal pattern of precipitation over the WNAO is of most interest in terms of potential impacts on wet scavenging of aerosol during the transport of North American pollution to Bermuda. In that regard, DJF shows the most pronounced levels of precipitation to the north and northwest of Bermuda over the WNAO, coincident with strong and frequent convection linked to frontogenesis (Painemal et al., 2021). This is consistent with how Painemal et al. (2021) showed that precipitation exhibits maximum levels over the Gulf Stream path owing to relatively high sea surface temperature and strong surface turbulent fluxes.

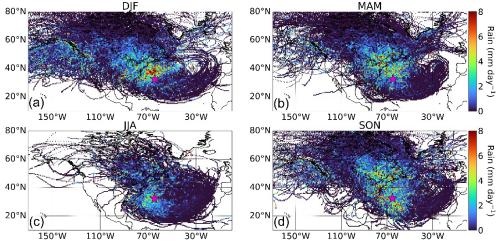


Figure 3. Seasonal maps (a-d) of average precipitation occurring in $0.5^{\circ} \times 0.5^{\circ}$ grids based on 10-day backward trajectories reaching Bermuda (32.30° N, 64.77°W; pink star) at 100 m (AGL). This analysis is based on trajectories between 1 January 2015 and 31 December 2019.

3.2 Trajectory Clustering

Prior to examining how precipitation directly impacts PM_{2.5} at Bermuda, we identify characteristic trajectory pathways using the hierarchical agglomerative clustering method described in Section 2.3.2. We reiterate that this analysis is based on 4 days of back-trajectories, rather than 10 days from Figs. 1-3, to focus more on transport closer to Bermuda. The optimum solution based on the L-method (see Section 2.3.2) resulted in eight trajectory clusters (Fig. 4a), with five (numbered 1-5) coming from North America and the remaining three (numbered 6-8) more characteristic of the anticyclonic circulation described already for JJA. The former five clusters account for 49% of the total trajectories, with the latter three responsible for the remaining 51%. The majority of trajectories from North America come offshore north of North Carolina (i.e., coastal areas north of ~35°N).



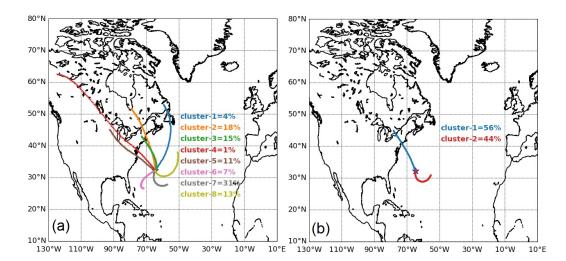


Figure 4. Cluster mean trajectories based on the (a) optimum solution having eight clusters and (b) a simplified solution with two clusters to enhance statistics for North American trajectories. Clustering was performed on four-day HYSPLIT backward trajectories between 1 January 2015 and 31 December 2019.

For the sake of simplicity of the remainder of the discussion, we reduced the number of characteristic trajectories to two (Fig. 4b) to have one from North America and the other from the southeast. Using only two clusters increases the number of data points in the North American cluster for more robust calculations of rain-aerosol relationships. Our choice to put together all North American air mass clusters into one group is aligned with a similar clustering choice by Chen and Duce (1983; see their Fig. 3) where trajectories were grouped together from Florida to the Canadian maritime provinces. Also, Mead et al. (2013) divided trajectory data ending at Bermuda into "Saharan" and "non-Saharan" seasons that generally coincide with our division of data into two clusters. Cluster 1 from North America accounts for 56% of trajectories and Cluster 2 from the southeast is linked to 44% of trajectories. It is clear from the two clusters that the North American air masses generally move faster as the characteristic 4-day back-trajectories originate farther away from Bermuda than that of Cluster 2.

Regardless of season, Cluster 1 was associated with higher APT values with the seasonal median values (units of mm) as follows (Cluster1/Cluster 2): DJF = 6.1/2.3; MAM = 5.2/1.8; JJA = 6.7/2.8; SON = 7.0/5.1. Figure 5 shows a box notch plot comparing APT between clusters for each season, demonstrating statistically significant differences in median values between clusters for a given season at 95% confidence. Furthermore, Cluster 1 exhibited higher CO levels at Bermuda for each season with median values (units of ppbv) as follows (Cluster 1/Cluster 2): DJF =89.7/76.3; MAM = 88.5/75.0; JJA = 68.9/58.7; SON = 81.6/65.6. Therefore, the combination of pollution outflow from North America and higher APT values makes Cluster 1 more ideal in terms of identifying potential wet scavenging effects on transported aerosol over the WNAO. The remainder of the study thus focuses on Cluster 1.



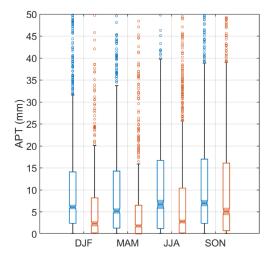


Figure 5. Box notch plot for each season comparing accumulated precipitation along trajectories (APT) for Clusters 1 (blue) and 2 (orange) from Fig. 4b. APT values were estimated from four-day HYSPLIT back trajectories reaching Bermuda (32.30° N, 64.77°W) at 100 m AGL. The middle, bottom, and top lines in each box represent the median, 25th percentile, and 75th percentile, respectively. Markers show extreme values identified based on 1.5×IQR (interquartile range) distance from the top of each box. Whiskers represent maximum and minimum values excluding extreme points. Boxes with notches and shaded regions that do not overlap have different medians at the 95% confidence level.

3.3 North America Trajectory Results

We next examine the relationship between APT and aerosol transport to Bermuda based on Cluster 1 results (Table 2). We compare data for "low" and "high" APT values based on thresholds being the 25th percentile (< 0.9 mm) and 75th percentile (> 13.5 mm), respectively, based on cumulative data from all seasons and years. As wet scavenging is expected to reduce PM_{2.5} during its transport from North America to Bermuda, we anticipate lower PM_{2.5} values at high APT. However, the results indicate this is only the case for MAM and JJA, with similar median values in SON and a higher median value in DJF for high APT conditions. Interestingly, NO, NO₂, NO_x, and CO were all significantly higher in DJF for high APT conditions too, raising the issue that absolute concentrations should be normalized to account for the differences in concentration that existed closer to North America prior to potential wet scavenging over the WNAO.

CO exhibits three important traits qualifying it as a species to normalize PM_{2.5} by: (i) a reliable marker of anthropogenic pollution stemming from North America (Corral et al., 2021); (ii) being relatively insensitive to wet scavenging processes; and (iii) having a long lifetime in the atmosphere (\sim 1 month; Weinstock, 1969) compared to aerosol particles. Consequently, we normalize PM_{2.5} by Δ CO to quantify transport efficiency and to reveal the potential effects of wet scavenging as has been done in past studies for other regions (Park et al., 2005; Garrett et al., 2010; Hilario et al., 2021; Matsui et al., 2011; Moteki et al., 2012; Oshima et al., 2012). We first determine the 5th percentile value of surface CO at Bermuda for each season for Cluster 1 trajectories and assume those are the seasonal background values as done also by Matsui et al.

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(2011). We then calculate \triangle CO as the difference between each 6-hourly CO data point at Bermuda and the background value for a given season. We only use data when \triangle CO > 3.2 ppbv to ensure a sufficiently high signal to noise ratio (Garrett et al., 2010).

Table 2. Seasonal medians of aerosol, gas, and meteorological variables for Cluster 1 divided into high- and low-APT categories. Differences in median values that are statistically significant (p-value < 0.05) based on a Wilcoxon rank-sum test are highlighted with bold and italic font. Percentage differences* between high- and low-APT median values are provided in parentheses. NO, NO_2 , NO_x , and $PM_{2.5}$ are based on Fort Prospect measurements, whereas all other parameters are from MERRA-2 with the exception of the two APT rows (derived from HYSPLIT and GDAS) and the last 8 rows corresponding to AERONET volume size distribution data. We combined all seasons for AERONET data to have sufficient statistics for comparisons (high APT = 16 points, low APT = 19 points). AERONET parameters include volume concentration (V), effective radii ($R_{\rm eff}$), volume median radii ($R_{\rm eff}$), and geometric standard deviation ($R_{\rm eff}$) with subscripts f and c for fine and coarse modes, respectively. Number of data points for each table entry is summarized in Table S1.





	High-rain (APT > 13.5 mm)/Low-rain (APT < 0.9 mm) (% Difference*)					
Parameter	DJF	MAM	JJA	SON		
NO (ppbv)	6.0/3.5 (71 %)	7.3/7.8 (-6 %)	8.3/13.1 (-37 %)	3.8/4.2 (-10 %)		
NO ₂ (ppbv)	13.9/12.8 (9 %)	13.4/12.0 (12 %)	8.6/6.6 (30 %)	9.4/9.2 (2 %)		
NO _x (ppbv)	19.6/17.5 (12 %)	21.2/21.8 (-3 %)	17.4/23.3 (-25 %)	14.1/14.2 (-1 %)		
CO (ppbv)	97.8/84.7 (15 %)	92.4/88.6 (4 %)	70.8/65.9 (7 %)	83.7/81.4 (3 %)		
$PM_{2.5} (\mu g m^{-3})$	6.1/5.5 (11 %)	6.7/7.3 (-8 %)	5.9/7.8 (-24 %)	5.5/5.1 (8 %)		
$PM_{2.5}/\Delta CO~(\mu g~m^{\text{-}3}~ppbv^{\text{-}1})$	0.29/0.62 (-53 %)	0.35/0.51 (-31 %)	0.32/0.37 (-14 %)	0.27/0.33 (-18 %)		
Sea-Salt (µg m ⁻³)	47.2/28.4 (66 %)	44.1/25.4 (74 %)	27.0/26.0 (4 %)	50.6/36.0 (41 %)		
Sea-Salt _{PM2.5} (µg m ⁻³)	6.2/4.0 (55 %)	6.2/4.1 (51 %)	4.9/4.9 (0 %)	6.8/5.0 (36 %)		
Dust (µg m ⁻³)	0.80/0.91 (-12 %)	2.32/3.03 (-23 %)	4.47/3.02 (48 %)	1.16/1.04 (12 %)		
$Dust_{PM2.5} (\mu g m^{-3})$	0.31/0.34 (-9 %)	0.79/1.00 (-21 %)	1.58/1.18 (34 %)	0.44/0.36 (22 %)		
Sea-Salt/ Δ CO (μ g m ⁻³ ppbv ⁻¹)	2.10/2.74 (-23 %)	2.54/1.70 (49 %)	1.50/1.58 (-5 %)	2.44/1.66 (47 %)		
Sulfate/ Δ CO (µg m ⁻³ ppbv ⁻¹)	0.029/0.055 (-47 %)	0.041/0.052 (-21 %)	0.039/0.046 (-15 %)	0.024/0.027 (-11 %)		
$Dust/\Delta CO~(\mu g~m^{\text{-}3}~ppbv^{\text{-}1})$	0.038/0.082 (-54 %)	0.129/0.186 (-31 %)	0.235/0.152 (55 %)	0.052/0.047 (11 %)		
$BC/\Delta CO~(\mu g~m^{\text{-}3}~ppbv^{\text{-}1})$	0.0031/0.0056 (-45 %)	0.0042/0.0057 (-26 %)	0.0041/0.0049 (-16 %)	0.0032/0.0033 (-3 %)		
$OC/\Delta CO~(\mu g~m^{-3}~ppbv^{-1})$	0.0093/0.0238 (-61 %)	0.0164/0.0276 (-41 %)	0.0225/0.0287 (-22 %)	0.0127/0.0153 (-17 %		
Sea-Salt _{PM2.5} /ΔCO (μg m ⁻³ ppbv ⁻¹)	0.263/0.403 (-35 %)	0.352/0.262 (34 %)	0.284/0.298 (-5 %)	0.331/0.255 (30 %)		
$Dust_{PM2.5}/\Delta CO~(\mu g~m^{\text{-}3}~ppbv^{\text{-}1})$	0.015/0.033 (-55 %)	0.042/0.062 (-32 %)	0.087/0.053 (64 %)	0.018/0.017 (6 %)		
Wind _{SF} (m s ⁻¹)	8.5/7.1 (20 %)	8.4/5.9 (42 %)	4.4/4.7 (-6 %)	7.7/6.6 (17 %)		
APT_{6h} (mm)	0.1/0.0 (NaN)	0.0/0.0 (NaN)	0.0/0.0 (NaN)	0.0/0.0 (NaN)		
APT (mm)	24.7/0.0 (NaN)	22.6/0.2 (11200 %)	24.1/0.0 (NaN)	25.0/0.2 (12400 %)		
	All					
$V_f/\Delta CO \times 10^4 (\mu m^3 \mu m^{-2} ppbv^{-1})$	3.42/7.55 (-55 %)					
$R_{\rm eff\text{-}f}\left(\mu m\right)$	0.158/0.147 (7 %)					
$R_{\mathrm{f}}\left(\mu m\right)$	0.176/0.171 (3 %)					
$\sigma_{ m f}$	0.471/0.470 (0 %)					
$V_c / \Delta CO \times 10^4 (\mu m^3 \mu m^{-2} ppbv^{-1})$	2.04/2.12 (-4 %)					
$R_{\text{eff-c}}\left(\mu m\right)$	1.956/2.085 (-6 %)					
R_{c} (μm)	2.503/2.562 (-2 %)					
$\sigma_{ m c}$	0.684/0.647 (6 %)					

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*% difference = $\frac{X_{High-rain}-X_{Low-rain}}{X_{Low-rain}} \times 100$



With the normalization technique, PM_{2.5}/ΔCO exhibits lower values in the high APT category for each season as compared to low APT conditions (Fig. 6), with differences between medians being statistically significant in DJF and MAM based on p-value < 0.05 with a Wilcoxon rank-sum test (Table 2). The DJF season exhibits the greatest reduction of this ratio (by 53%) in high APT conditions (0.29 μg m⁻³ ppbv⁻¹ versus 0.62 μg m⁻³ ppbv⁻¹ based on median values; Table 2). Therefore, these results suggest that it is plausible that wet scavenging has a marked impact on surface PM_{2.5} at a remote ocean site in the WNAO. This also helps support the speculation proposed by Aldhaif et al. (2021) that wet scavenging can reconcile why, in particular for DJF, the high density of trajectories coming from North America correlates with a reduction in fine particulate pollution arriving at Bermuda as compared to other seasons. It is noteworthy that the highest median value of PM_{2.5}/ΔCO was for the low APT category of DJF providing support for how that season has both greater influence of aerosol transport from North America (when the precipitation scavenging potential is reduced during low APT periods) and the greatest sensitivity to the effects of precipitation over the WNAO owing to the widest range in this ratio's value between high and low APT categories.

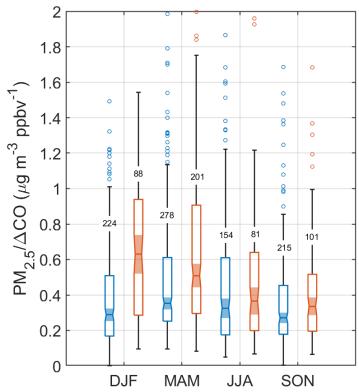


Figure 6. Box notch plot for each season comparing the $PM_{2.5}/\Delta CO$ ratio for Cluster 1 trajectories for high-APT (blue) and low-APT (orange) conditions. APT thresholds are based on 25^{th} (< 0.9 mm) and 75^{th} (> 13.5 mm) percentiles of APT for all trajectories reaching Bermuda between 1 January 2015 and 31 December 2019. The number of samples in each group is placed on whiskers.



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Figure 7 additionally shows the seasonal sensitivity of PM_{2.5}/ Δ CO to APT based on four bins of APT chosen in such a way to provide similar numbers of data points per bin for each particular season. DJF and MAM show the greatest reductions from the first to last bin as expected based on Table 2, but these also were the only two seasons showing reductions between each successive bin. In contrast, SON and JJA exhibited more variable behavior with PM2.5/ΔCO actually increasing between a pair of bins in each season. A number of reasons can potentially explain the less pronounced reduction in PM_{2.5}/ Δ CO for SON and JJA: (i) lower values to begin with in the lowest APT bins (and thus lower potential for scavenging to occur); (ii) potential humidity effects associated with air masses at higher APT values promoting secondary aerosol formation (Huang et al., 2014; Quan et al., 2015; Ding et al., 2021); (iii) more influence from natural emissions in the form of dust (especially JJA) and sea salt (especially SON) (Aldhaif et al., 2021). Another noteworthy result is that the season with the clearest scavenging signature (DJF) shows the most sensitivity (i.e., steepest downward slope) between the first two APT bins (0.9 mm versus 4.3 mm) as there was a 26% reduction in PM_{2.5}/ Δ CO (0.584 μ g m⁻³ ppbv⁻¹ to 0.435 μ g m⁻³ ppbv⁻¹), resulting in a slope (units of µg m⁻³ ppbv⁻¹ mm⁻¹) of -0.044 in contrast to slopes of -0.007 and -0.006 for the subsequent two pairs of bins in DJF.

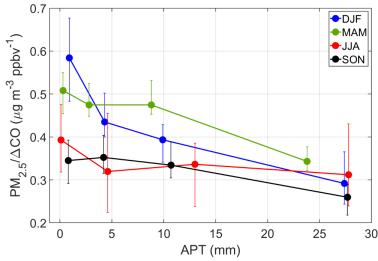


Figure 7. Seasonal sensitivity of $PM_{2.5}/\Delta CO$ to APT for Cluster 1 trajectories, divided based on four APT bins that have a similar number of data points per season. Markers denote median values and error bars represent the 95% confidence interval for medians based on a bootstrapping method (n = 100,000). Number of points per marker: DJF = 192 – 194; MAM = 247 – 251; JJA = 107 – 110; SON = 183 – 191.

We next address some additional details motivated by values shown in Table 2. We examine three aerosol constituents linked to anthropogenic outflow from North America, including sulfate, black carbon (BC), and organic carbon (OC) from MERRA-2 reanalysis. We recognize that sulfate and OC have non-anthropogenic precursor vapors such as ocean-emitted dimethyl sulfide and biogenic volatile organic compounds, respectively. Being the most abundant of the three, sulfate exhibits the same characteristics as $PM_{2.5}$ when normalized by ΔCO with the sharpest reduction at high APT conditions in DJF, followed by MAM, and then finally by JJA and SON





albeit with p-values > 0.05 for the latter two seasons as compared to low APT conditions. BC/ Δ CO ratios show the same relative characteristics between APT categories as sulfate/ Δ CO for each season, and mostly the same for OC/ Δ CO except that the reduction in the median value in high APT conditions for SON was significant (p-value < 0.05). Regardless of season, but most pronounced in DJF, was the consistent result that OC/ Δ CO exhibited the highest relative reduction at high APT conditions (versus low APT) compared to BC and sulfate. Further work with more expansive observational data is needed to better understand how different species respond to wet scavenging.

Normalization by ΔCO was important for assessing transport efficiency of anthropogenic pollution, but we also considered dust and sea salt without ΔCO normalization as they are predominantly emitted by natural sources. Although outside the scope of this study, we caution that MERRA-2 concentrations of sea salt in the PM_{2.5} fraction may exceed those of total PM_{2.5} as measured at Ft. Prospect (Table 2) owing to the inherent differences in the two respective datasets including the larger spatial scale covered by MERRA-2 as compared to the point measurements at Ft. Prospect. Previous analysis of precipitation scavenging ratios over Bermuda showed that larger aerosol types (e.g., sea salt) are removed more efficiently than smaller aerosol types (e.g., sulfate, nitrate) (Galloway et al., 1993). Total sea salt and sea salt in the PM_{2.5} fraction exhibited higher median concentrations for the high APT category (p-value < 0.05) for all seasons except JJA, which had more comparable values. This can be explained by how the high APT days exhibited significantly higher surface wind speeds around Bermuda for all seasons except JJA, for which wind speeds in general were depressed. Therefore, the reduction of the PM_{2.5}/ΔCO ratio in high APT conditions may actually be an underestimate of wet scavenging of North American pollution outflow since local sea salt is higher windier days marked by high APT.

To put this last assertion on firmer ground, we examined local rain values as they could be influential in terms of scavenging the locally generated sea salt. The median values of local rain on high APT days for each season based on APT for the most recent 6 hours of trajectories arriving at Bermuda (APT_{6h}) were 0.0-0.1 mm, while median values of APT_{6h} on low APT days were 0 mm in each season. The only significant difference in median APT_{6h} values was in DJF when it was 0.1 mm on high APT days in contrast to 0.0 mm on low APT days. Therefore, for DJF the slightly enhanced APT_{6h} can possibly offset the greater sea salt emissions in terms of impacting PM_{2.5} levels over Bermuda. Results for the other major natural aerosol type (dust) reveal much lower overall concentrations as compared to sea salt for both bulk sizes and the PM_{2.5} fraction. There was no consistent trend across the four seasons in terms of dust levels being higher for either the low or high APT category, which is not unexpected as dust is not a major aerosol type expected from North American outflow (Yu et al., 2020; Corral et al., 2021).

3.3.1 Volume Size Distributions

We next examine AERONET volume size distribution (VSD) relationships with APT. We normalize the volume concentration data by corresponding ΔCO in the same way as was done for PM_{2.5}, with the same condition of using data only when $\Delta CO > 3.2$ ppbv. A few cautionary details are first noted about these data in comparison to APT: (i) there are limited VSD data in the AERONET dataset, which is why we use all seasons of data together for Fig. 8 and Table 2; (ii) AERONET data are representative of ambient conditions and changes in relative humidity can influence VSD profiles; and (iii) AERONET data are column-based and not necessarily representative of only the surface layer where the trajectories end in our analysis of HYSPLIT data. Related to the last point, past work noted that column optical properties over Bermuda can



be weakly correlated with such measurements at the surface (Aryal et al., 2014) due largely to aerosol layers aloft (Ennis and Sievering, 1990). At the same time, studies have shown that there can be enhanced number and volume concentrations in the marine boundary layer versus the free troposphere over Bermuda (Horvath et al., 1990; Kim et al., 1990).

The median VSDs for both APT categories exhibit a bimodal profile with a more dominant coarse mode, consistent with what is already known for Bermuda based on AERONET data (Aldhaif et al., 2021). The unique aspect of this work is that in high APT conditions, there is a reduction in median volume concentration in the smaller mode between radii of 0.05 and \sim 1 μ m, with a slight enhancement on the leading shoulder of the larger mode between radii of 1.71 and 2.94 μ m (Fig. 8). The greatest relative reductions in the fine mode, which is more indicative of transported continental pollution, occurred between midpoint radii of 0.15 and 0.33 μ m with relative reductions in those four bins (i.e., midpoint radii = 0.15, 0.19, 0.26, and 0.33 μ m) ranging from 38% to 52%. The coarse mode peaked at larger radii (3.86 μ m) in low APT conditions relative to high APT conditions (2.94 μ m).

Table 2 reports VSD parameter values for the APT categories separated by fine and coarse modes. Although only significantly different based on 90% confidence (p-value = 0.09), the fine mode volume concentration normalized by Δ CO in the high APT category was less than half (45%) the value in the low APT category. There were insignificant differences between effective radii and volume median radii, in addition to the geometric standard deviation for the fine mode between APT categories. For the coarse mode, only the geometric standard deviation exhibited a significant difference by being higher in the high APT category (0.684 versus 0.647), although we presume that has less to do with actual scavenging effects and more to do with different times of the year where the relative abundance of different coarse particle type changes.

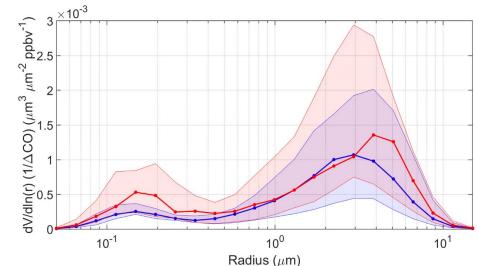


Figure 8. Volume size distributions (VSD) normalized by ΔCO for high APT (> 13 mm; blue, n = 16) and low APT (< 0.9 mm; red, n = 19) groups for Cluster 1 trajectories. Thick curves correspond to medians and shaded areas extend to the 25th and 75th percentiles. VSDs are based on AERONET data between 1 January 2015 and 31 December 2019.





The AERONET results support the idea that scavenging on high APT days efficiently removes fine particulate matter but that there can still be appreciable levels of locally generated sea salt due to higher local surface winds on high APT days. Related to the columnar nature of AERONET data, it is important to note that others have reported large-scale subsidence of pollution from the mid and upper troposphere, especially in spring, based on enhanced ozone mixing ratios at the surface of Bermuda (Oltmans and Levy, 1992; Cooper et al., 1998; Milne et al., 2000; Li et al., 2002). Moreover, this phenomenon is synoptically favorable with the transport of North American polluted air behind cold fronts especially in spring (Moody et al., 1995) and often linked to the lifting of polluted air out of the boundary layer by convection over the continental U.S. (Prados et al., 1999). It is unclear based on the current dataset how effective these events were in impacting either the surface layer or columnar-based aerosol measurements at Bermuda.

3.4 GEOS-Chem Model Results

We conduct four GEOS-Chem simulations of the ²¹⁰Pb submicron aerosol tracer including a) one standard simulation; b) same as the standard simulation but with the ²²²Rn tracer emissions from the North American continent (25-60°N, 130-70°W) removed; c) same as the standard simulation but without ²¹⁰Pb scavenging due to large-scale precipitation; and d) same as the standard simulation but without ²¹⁰Pb scavenging by convective precipitation. The difference between a) and b) quantifies the North American contribution to atmospheric ²¹⁰Pb concentrations. The difference between a) and c) reflects the role of large-scale precipitation scavenging, while the difference between a) and d) reflects that of convective precipitation scavenging in determining atmospheric ²¹⁰Pb concentrations. All model simulations are conducted for the period from September 2016 to December 2017 with the first four months for spin-up. Monthly mean outputs for 2017 are used for analysis, which is a representative year within the time frame of the analysis presented in Sections 3.1-3.3.



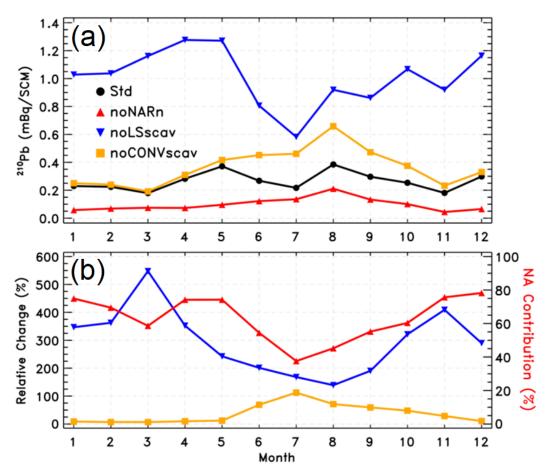


Figure 9. Simulated monthly surface ²¹⁰Pb tracer concentrations submicron mBq/SCM at Bermuda (32.31° N, 64.75° W) in 2017 as a way to assess effects of precipitation scavenging on North American outflow. Panel (a): monthly mean surface ²¹⁰Pb concentrations in the standard simulation ("Std") and three sensitivity simulations, i.e., without North American ²²²Rn emissions ("noNARn"), without large-scale precipitation scavenging ("noCONVscav"). Panel (b): percentage changes, i.e., (noLSscav-Std)/Std×100 in blue and (noCONVscav-Std)/Std×100 in orange, and the North American contribution in red, i.e., (Std-noNARn)/Std×100.

Figure 9a shows monthly mean surface ²¹⁰Pb concentrations at Bermuda for 2017 in the standard simulation and three sensitivity simulations. Figure 9b plots the relative changes in simulated ²¹⁰Pb concentrations due to the effects of large-scale or convective precipitation scavenging. Also included in Fig. 9b is the North American contribution. The standard model simulates a seasonality in ²¹⁰Pb concentrations with two distinct peaks in May and August (upper panel). The May peak is a result of increased transport from North America in combination with reduced scavenging. In contrast, the August peak results from long-range transport from other continents (e.g., North Africa, Europe) along the southern edge of the Bermuda High. The lows in



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March and November are attributed to strong large-scale precipitation scavenging, and the low in July is associated with enhanced convective precipitation scavenging. The sensitivity simulations clearly show that the role of large-scale precipitation scavenging in affecting surface ²¹⁰Pb concentrations at Bermuda is much larger in winter/spring than in summer, with a maximum in March (lower panel), while convective scavenging also plays an important role in summer. The relative contribution of North American ²²²Rn emissions is largest in winter (~75-80%), suggesting air masses reaching Bermuda often experience large-scale precipitation scavenging while traveling from the North American continent during winter. These model results are thus consistent with previous results shown already and put our conclusions on firmer ground.

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3.5 Airborne Case Study

The DJF season has been shown in this study to unite the greatest potential for wet scavenging and the highest density of trajectories from North America reaching Bermuda. To probe deeper now, we take advantage of data from ACTIVATE RF6 on 22 February 2020, which characterized the intermediate region between North America and Bermuda. Weather in the ACTIVATE domain on this day was characterized by a transition from post-cold front conditions to high pressure. A cold front passed over Bermuda the previous day at approximately 18:00 UTC on 21 February, and by the flight period of RF06 was approximately 600 km southeast of the island. Meanwhile, a broad but weakening area of surface high pressure continued eastward into the southeast U. S. Winds in the boundary layer were southwesterly at around 5 m s⁻¹ near the base of operations (NASA Langley Research Center; Hampton, Virginia), which were associated with a weak trough on the northeast side of the high pressure system. These winds shifted to northnorthwest near the coast at 2.5 m s⁻¹ and north-northeast at 7.4 m s⁻¹ near the far end of the flight track; Bermuda reported north-northeast winds around 9 m s⁻¹ during this period. Aloft, 500 hPa flow was from the west-northwest. NASA Langley reported few to no clouds during the flight period, while Bermuda reported broken clouds with multiple layers (with bases around 900 m and 1800 m) and rain showers at or near the airport. This is consistent with satellite imagery (Fig. 10a), which shows an area of scattered to broken cumulus and stratocumulus extending from the cold front near Bermuda to the edge of the Gulf Stream off the U.S. East Coast. Satellite-retrieved cloud bases were at 1-2 km, with cloud tops ranging from 1.5-3.5 km; from the HU-25 Falcon flight legs, cloud bases encountered along the flight track were 750-1100 m and cloud tops were 1200-1800 m.



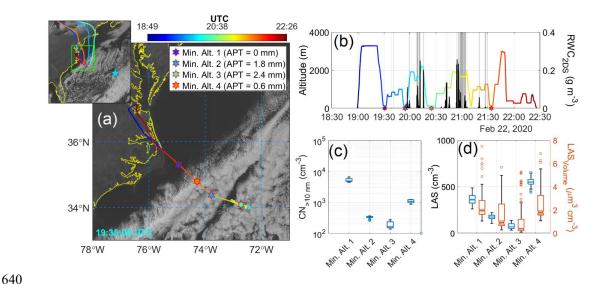


Figure 10. Summary of ACTIVATE's Research Flight 6 on 22 February 2020. (a) HU-25 Falcon flight track overlaid on GOES-16 imagery with the smaller figure to the top left being a zoomed-out version of the WNAO (Bermuda denoted by blue star) and the larger figure zooming in on the area of the flight path. The midpoint of the four Min. Alt. legs are marked along with values for the accumulated precipitation along the trajectory (APT) for the recent history of the sampled air masses when they were over the ocean (time over land excluded from APT calculation). (b) Time series of Falcon altitude colored by flight UTC time (color bar in panel a) and rain water content (RWC) from the 2DS probe. Gray shaded bars signify when FCDP liquid water content exceeded 0.05 g m⁻³, indicative of cloud legs. The same four colored stars from (a) are shown on the x-axis to indicate where they occurred. (c-d) Box notch plots of the leg-mean Min. Alt. values of CPC particle (> 10 nm) concentration, and the number and volume concentrations of the LAS (> 0.09 μm).

Figure 10a shows the general flight path, which involved flying to a point southeast of the operations base (Hampton, Virginia) and then re-tracing the path back to land. Four HYSPLIT back-trajectories are shown (Fig. 10a) corresponding to midpoints of each Min. Alt. leg when the aircraft was at its lowest altitude (~500 ft). APT calculations were conducted for segments of those four trajectories that were over the ocean. As a successful validation of the technique, no rain accumulated up to the point of the Min. Alt. 1 leg, as there were cloud-free conditions between land and that offshore point. In contrast, the next three Min. Alt. legs show higher APT values ranging from 0.6 to 2.4 mm, consistent with the GOES-16 imagery showing cloud fraction increasing just to the southeast of the Min. Alt. 1 leg. Expectedly, APT values progressively increased with offshore distance as a result of air masses being exposed to clouds for longer periods.

Shortly after the Min. Alt. 1 leg, the Falcon conducted two consecutive pairs of BCB and ACB legs (i.e., below cloud base followed by above cloud base), followed by a slant descent to the Min. Alt. 2 leg, where RWC values were enhanced (up to 0.02 g m⁻³ at 19:55:22 UTC) owing



 to precipitation from overlying clouds. Very shortly thereafter, RWC reached as high as 0.11 g m³ (19:56:50 UTC) in the slant ascent profile passing through clouds. The APT value in Min. Alt. 2 leg was 1.8 mm. A significant reduction was observed in the aerosol number and volume concentrations for the Min. Alt. 2 leg as compared to the Min. Alt. 1 leg (Figs. 10c-d). CPC (> 10 nm) concentrations dropped by 93% from a leg-median value of 4938 cm⁻³ during Min. Alt. 1 to 345 cm⁻³ during Min. Alt. 2, whereas the LAS number and volume (> 100 nm) concentrations dropped from 360 cm⁻³ to 174 cm⁻³ and from 2.0 μm³ cm⁻³ to 0.9 μm³ cm⁻³, respectively. Size distribution data in those two legs show a significant reduction in particle concentration across the full diameter range as measured by the SMPS and LAS (Fig. 11). A notable feature from the SMPS was a pronounced peak between 3.5 – 14.1 nm suggestive of nucleation, that was absent in subsequent Min. Alt. legs, presumably owing to some combination of coagulation and scavenging.

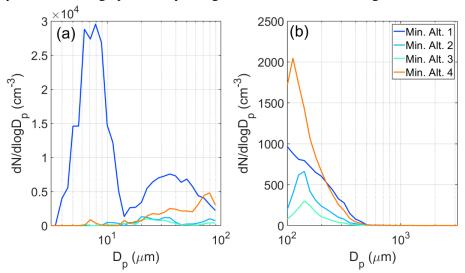


Figure 11. Aerosol size distribution comparison (a = SMPS, b = LAS) between the four HU-25 Falcon Min. Alt. legs during ACTIVATE Research Flight 6, as shown in Fig. 10.

The aircraft continued southeast after the Min. Alt. 2 leg and passed through more patches of precipitation, leading to the highest APT value of 2.4 mm in the Min. Alt. 3 leg, where legmedian values were as follows: $CPC = 165 \text{ cm}^{-3}$, LAS number = 66 cm^{-3} , LAS volume = $0.4 \mu m^3 \text{ cm}^{-3}$. While the SMPS distributions in the Min. Alt. 2 and 3 legs were very similar, the LAS size distribution in the Min. Alt. 3 leg is shifted towards lower concentrations, especially below 400 nm. On the path back towards Virginia, the Falcon conducted one final Min. Alt. 4 leg right before the boundary between cloudy and clear air, with the APT value being 0.6 mm. Between the Min. Alt. 3 and 4 legs, again, significant RWC values were observed reaching as high as 0.26 g m^{-3} at 20:54:20 UTC. Aerosol concentration measurements increased relative to the Min. Alt. 2 and 3 legs (leg-median values): $CPC = 1076 \text{ cm}^{-3}$, LAS number = 545 cm^{-3} , LAS volume = $1.8 \mu m^3 \text{ cm}^{-3}$. It is difficult to compare results from the Min. Alt. 1 and 4 legs as $\sim 2 \text{ hours had passed and there}$ were different conditions impacting the two respective sampled air masses. The size distributions varied considerably for the Min. Alt. 4 leg as compared to the other three legs with increased





concentrations between 20-200 nm, presumably as a result of continued pollution outflow and more photochemistry and aerosol growth processing as compared to earlier in the day.

To conclude, it is plausible based on the case flight data that the emerging presence of clouds and precipitation led to the substantial reduction of aerosol particles with distance offshore via wet scavenging processes. Further research is warranted with more extensive data to move closer to showing causal relationships between precipitation and aerosol particles. For instance, a few points of caution from RF6 are worth mentioning. First, the coastal trajectories in Fig. 10 corresponding to the different Min Alt. legs originated from varying places extending from the Virginia coast up north towards Cape Cod, Massachusetts. Secondly, cloud dynamics and boundary layer structure can vary offshore. Related to the latter, PBLH data obtained from MERRA-2 along the flight track revealed that there were deeper boundary layers farther offshore, but not sufficiently deeper to fully explain the reductions in aerosol concentration: Min. Alt. 1/2/3/4 = 1156/1728/1740/1530 m. Lastly, aerosol concentrations linked to continental outflow naturally decrease anyways offshore, including in cloud-free conditions, owing to dilution during transport.

4. Conclusion

This study examines the sensitivity of surface aerosol characteristics over a remote area of the western North Atlantic Ocean (Bermuda) to precipitation along trajectories coming from North America. Based on trajectory clustering with HYSPLIT data, two characteristic transport corridors to Bermuda's surface layer (100 m AGL) were identified, with the focus being the one coming from North America (Cluster 1). Seasonal analysis of HYSPLIT and Bermuda surface data showed that JJA is distinct in terms of having transport from the southeast with the other seasons, especially DJF, having more North American influence with higher concentrations of CO. Comparing Cluster 1 trajectories data between high (>13.5 mm) and low (<0.9 mm) APT, there was a clear signature of wet scavenging effects by precipitation with more than a two-fold reduction in PM_{2.5}/ Δ CO in DJF (0.29 µg m⁻³ ppbv⁻¹ versus 0.62 µg m⁻³ ppbv⁻¹), with the reduction being less severe for other seasons. The greatest sensitivity of PM_{2.5}/ Δ CO to APT was at the lowest values (up to ~5 mm; slope of -0.044 µg m⁻³ ppbv⁻¹ mm⁻¹), above which the descending slope of PM_{2.5}/ Δ CO versus APT was less steep.

Speciated data indicate that anthropogenic species such as sulfate, black carbon, and organic carbon are reduced as a function of APT (much like PM2.5). However, sea salt was not necessarily reduced and at times could even be higher at Bermuda with high APT conditions, which is attributed to higher local wind speeds and emissions at the surface on days simultaneous with high APT trajectories. Analysis of AERONET volume size distribution data at Bermuda confirms the substantial reduction of fine mode volume concentrations in contrast to less change in the coarse mode on high APT days. GEOS-Chem simulations of the radionuclide aerosol tracer ²¹⁰Pb confirm that North American influence at the surface of Bermuda is highest in DJF, with those air masses significantly impacted by large-scale precipitation; furthermore, convective scavenging is shown to play an important role in summer months. A research flight from ACTIVATE on 22 February 2020 demonstrates a significant gradient in aerosol number and volume concentrations offshore of North America as soon as trajectories start passing across clouds, consistent with increasing APT away from the coast leading to increased aerosol particle removal.

Our results have implications for other remote marine regions impacted by transport of continental emissions. These results also highlight the important role of precipitation in modifying

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aerosol levels, including potentially their vertical distribution (e.g., Luan and Jaeglé, 2013), along continental outflow trajectories. We show that cloud and precipitation processes along trajectories have significant impacts on resultant aerosol characteristics, suggesting that wet scavenging processes in models require stronger constraints than other aerosol microphysical/chemical processes to improve the forecasting of aerosol properties in marine atmospheres.





- 750 Data Availability.
- 751 Fort Prospect Station Aerosol/Gas Measurements:
- 752 https://doi.org/10.6084/m9.figshare.13651454.v2
- 753 AERONET: https://aeronet.gsfc.nasa.gov/
- 754 HYSPLIT: https://www.ready.noaa.gov/HYSPLIT.php
- 755 MERRA-2: https://disc.gsfc.nasa.gov/
- 756 GEOS-Chem Model: http://wiki.seas.harvard.edu/geos-chem/index.php/GEOS-Chem v11-01
- 757 Section 3.5 ACTIVATE Airborne Data:
- https://doi.org/10.5067/SUBORBITAL/ACTIVATE/DATA001 758
- 759 Section 3.5 airport weather data: http://mesonet.agron.iastate.edu/ASOS/
- 760 Section 3.5 ocean surface analysis charts and GFS 500 hPa analysis:
- 761 https://www.ncei.noaa.gov/data/ncep-charts/access/
- 762 Section 3.5 North America Analysis/Satellite composite:
- 763 https://www.wpc.ncep.noaa.gov/archives/web pages/sfc/sfc archive maps.php
- 764 Section 3.5 Satellite imagery/products: https://satcorps.larc.nasa.gov/cgi-
- 765 bin/site/showdoc?docid=4&cmd=field-experiment-homepage&exp=ACTIVATE
- 766 Author contributions. HD and MA conducted the analysis. AS and HD prepared the manuscript.
- 767 HL and BZ performed GEOS-Chem model radionuclide simulations and output analysis. All
- 768 authors contributed by providing input and/or participating in airborne data collection.
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