Spatial source contribution and interannual variation in deposition of dust aerosols over the Chinese Loess Plateau

Ove Haugvaldstad[1,3], Hui Tang[1,2,5], Anu Kaakinen[2], Christine D. Groot Zwaaftink[6], Henrik Grythe[6], Katja Bohm[2,4], Thomas Stevens[4,2], Zhongshi Zhang [7], Frode Stordal[1]

[1]Department of Geosciences, University of Oslo, Norway
[2]Department of Geosciences and Geography, University of Helsinki, Finland
[3]Norwegian Meteorological Institute, Oslo, Norway
[4]Department of Earth Sciences, Uppsala University, Sweden
[5]Finnish Meteorological Institute (FMI), Climate System Research, Helsinki, Finland
[6]Norwegian Institute for Air Research, Kjeller, Norway.
[7]Department of Atmospheric Science, School of Environmental studies, China University of Geoscience, 430074 Wuhan, China.

Key Points:

- The source contribution of emitted dust aerosols to the Chinese Loess Plateau (CLP) is mapped using backward trajectory modeling.
- Distant dust emission regions in Central Asia have a non-negligible impact on the CLP, with wet-deposited dust showing a clearer connection.
- Strong dust deposition years over the CLP are associated with the negative phase of the Arctic Oscillation.

Corresponding author: Ove Haugvaldstad, `o.w.haugvaldstad@geo.uio.no`

Abstract

The Chinese Loess Plateau (CLP) in northern China serves one of the most prominent loess records in the world. The CLP is an extensive record of changes in past aeolian dust activity in East Asia; however, the interpretation of the loess records is hampered by ambiguity regarding the origin of loess-forming dust and an incomplete understanding of the circulation forcing dust accumulation. In this study, we used a novel modeling approach combining a dust emission model FLEXDUST with simulated back trajectories from FLEXPART to trace the dust back to where it was emitted. Over 21 years (1999-2019), we modeled back trajectories for fine ($\sim 2\ \mu$m) and super-coarse ($\sim 20\ \mu$m) dust particles at six CLP sites during the peak dust storm season from March to May. The source receptor relationship from FLEXPART is combined with the dust emission inventory from FLEXDUST to create site-dependent high-resolution maps of the source contribution of deposited dust. The nearby dust-emission areas dominate the source contribution at all sites. Wet deposition is important for dust deposition at all sites, regardless of dust size. Non-negligible amounts of dust from distant emission regions could be wet deposited on the CLP following high-level tropospheric transport, with the super-coarse dust preferentially from emission areas upwind of sloping topography. On an interannual scale, the phase of the Arctic Oscillation (AO) in winter was found to have a strong impact on the deposition rate on the CLP, while the strength of the East Asian Winter Monsoon was less influential.

Plain Language Summary

The dust deposits on the Chinese Loess Plateau (CLP) in northern China provide an extensive record of changes in past dust activity in East Asia. In this work, we combine an atmosphere transport model with a dust emission model to trace the dust backward to where it was emitted. Choosing six locations at the CLP where we trace the dust back to emissions over a 21-year period during the most active dust months from March until May, for which we investigated how different parts of the CLP were influenced by the different dust emission areas, transport mechanisms, and wind circulation patterns. We find that dust is mainly brought from the emissions areas located near the CLP, still dust from far-away emissions areas in Central Asia has the potential to reach the CLP in smaller amounts. Furthermore, our results show that wet removal of dust by precipitation is important for dust deposition on the CLP, a mechanism that is often overlooked when explaining variations in past dust activity. On a year-to-year basis the dust deposition rate over the CLP was found to be connected to the high-latitude northern hemisphere's climate oscillation (Arctic Oscillation) rather than the regional East Asian winter monsoon.

1 Introduction

Mineral dust is deeply embedded within the Earth system, influencing the planet's energy balance, cloud characteristics, atmospheric chemistry, and biogeochemistry (Shao et al., 2011; Kok et al., 2023) . Dust is mainly emitted from dry and sparsely vegetated arid and semi-arid regions. Emission is driven by surface winds that lift sand grains from the soil bed, where the impact upon reentry ejects and fragments smaller soil particles, which then get transported. The dust-emitting capacity of the soil is strongly influenced by environmental factors such as soil moisture, vegetation, soil texture, and the structure of the top soil. On geological time scales, dust depositional records show increases in dust activity during glacial periods (Porter, 2001; Maher, 2016). However, as human expansion has increased the intensification of land use in recent years, we are now seeing a profound impact of human activity on dust activity, e.g. the drying of Aral Sea and dust bowl in the 1930s

North America. The antropogenic signal is also evident in the depostional records, which show that in the last 150 years there has been an increase in the dust burden globally of about 50% (Hooper & Marx, 2018). However, we do not know to what extent this is due to a forcing caused by increased human activity and changes in land use in semi-arid regions or to modifications in precipitation and wind patterns in a changing climate (Kok et al., 2023).

Changes in dust activity are important because of the climate effect of dust. Fine dust aerosols exhorts cooling effect due to its ability to reflect incoming sunlight , whereas coarse dust aerosols cause a warming effect as they interact with the outgoing long-wave radiation. Furthermore, different dust-emitting regions have different dust mineralogy, which affects its ability to absorb radiation (Dubovik et al., 2002). Atmospheric dust particles also affect clouds by acting as nuclei for condensation, contributing to droplet formation. Additionally, dust particles act as nuclei to initiate glaciation of clouds above the temperatures of homogeneous freezing. Ice clouds generally have a warming effect, whereas liquid clouds have a cooling effect (Storelvmo, 2017). The deposition of dust on snow accelerates snow melt (Wittmann et al., 2017; Sarangi et al., 2020), while dust input can increase ecosystem productivity in regions lacking nutrients, by providing iron or phosphorus (Martin, 1990; Yu et al., 2015). These processes impact the climate system, but the complexities introduced by the poor constraints of, for example, dust particle size (A. Adebiyi et al., 2023; Ryder et al., 2018), shape (Huang et al., 2020), mineralological composition (Li et al., 2021) and dust-cloud interactions (Sagoo & Storelvmo, 2017) of airborne dust particles, make the overall climatic effect of the dust uncertain (Kok et al., 2023).

One of the most prominent dust records on Earth for studying environmental drivers of changes in the dust cycle is the Chinese Loess Plateau (CLP), located in the north central part of China (Figure 1). Here windblown dust has been accumulating since at least the late Oligocene-early Miocene (c. 25-22 Ma) (Guo et al., 2002; Qiang et al., 2011), providing a long-term, nearly continuous record of past responses of the East Asian Dust Cycle (EADC) to environmental and climatic changes (e.g. Stevens et al., 2007; Lu et al., 2010; Maher, 2016; Y. Sun et al., 2020).

The sediment sources, dust-emitting regions, transportation, and deposition processes of the eolian deposits on the CLP are debated (e.g. W. Peng et al., 2023; H. Zhang et al., 2022; Shang et al., 2016; Bird et al., 2015; D. Sun et al., 2008). However, most agree that the dust was generally sourced from the dry Asian interior and proximal deserts via energetic, surface-level northwesterly winds driven by the East Asian Winter Monsoon (EAWM) system (Z. Ding et al., 1999). In addition to the EAWM, the prevailing mid-latitude westerlies in the middle and upper troposphere play an important role in transporting dust to the CLP. The EAWM and the westerlies are suggested to explain the bimodal particle size distribution widely observed in the CLP records. The coarse particles are suggested to be transported by the strong surface winds associated with the EAWM and the fine particles are suggested to represent the background dust component of the CLP transported by the high-level westerly air flow (Miao et al., 2004; D. Sun, 2004; D. Sun et al., 2008). Furthermore, both the particle size distribution and the dust accumulation of the loess records exhibit a northwest-southeast gradient (Z. Ding et al., 1999), which further supports the northwesterly and westerly wind driven transport pathways.

Recent studies using single grain provenance indicators on the CLP dust records shed more light on dust emission areas and transport pathways, and their variation in the geologic past (Bird et al., 2015; Shang et al., 2016; Nie et al., 2018; H. Zhang et al., 2021, 2022; Bohm et al., 2023; W. Peng et al., 2023). However, the interpretation of the CLP provenance records is hampered by the complexity of the source-to-sink system and by the fact that dust provenance signals reflect not only the trans-

porting wind systems, but also the various processes that affect dust availability in the source regions. Furthermore, single grain provenance ultimately tells us what the source rocks and sediments are, which might be different from the dust-emitting regions.

Several provenance studies have reported spatial provenance differences across the CLP for both Neogene Red Clay and Quaternary loess (e.g. Bird et al., 2015; Shang et al., 2016; H. Zhang et al., 2021; W. Peng et al., 2023). However, the cause of the spatial differences in provenance is not well established. The Yellow River has been argued to cause these spatial differences by bringing material from the Northern Tibetan Plateau closer to the CLP before the final aeolian transport step (Stevens et al., 2013; Nie et al., 2015). Contrasting eolian dust transport pathways for different parts of the CLP have also been proposed to add to the spatial difference (Shang et al., 2016), with the northern and northeastern parts of the CLP dominated by dust from the northwestern deserts via the EAWM, and the southern and southwestern parts of the CLP dominated by dust from the Northern Tibetan Plateau and even the remote Taklamakan desert via the westerlies (Shang et al., 2016).

Applications of the provenance method to further unravel the dust cycle over the CLP is also hampered by the fact that most single grain provenance approaches are based on a relatively large particle size (> 20 μm). Our understanding of the transport of such large dust particles in the atmosphere is still limited and highly debated (A. Adebiyi et al., 2023). Super-coarse dust particles (sensu A. Adebiyi et al. (2023), $> 20\mu$m) have commonly been assumed to be transported only a short distance (1-100 km) from the source region because of the high gravitational settling velocity (Tsoar & Pye, 1987), which contradicts CLP provenance inferences of dust derived from remote deserts, such as the Taklamakan. Furthermore, recent observations have documented the possibility of long-distance transportation (> 1000 km) of giant ($> 62.5\mu$m) dust particles (Van Der Does et al., 2018; Varga et al., 2021). A better understanding of large dust particle transportation to the CLP will help the interpretation of dust provenance proxies, and thus improve our understanding of the EADC on geological time scales.

Dust models have been widely applied to understand the EADC, however, there have been only limited cases where dust models have been applied to understand the formation of the CLP dust records in particular (Shi & Liu, 2011). Moreover, previous modeling studies of past and present EADC have typically applied global or regional climate models (Shi & Liu, 2011; S. L. Gong et al., 2006), which mainly consider particles within the fine to coarse range ($< 10\mu$m) (Zhao et al., 2022). These models are also unable to determine the exact sources of emitted dust for different locations at the CLP, which would greatly enhance the provenance interpretations of the CLP dust records. To address these issues, we used the Lagrangian particle dispersion model FLEXPART. We run FLEXPART backward in a receptor-oriented viewpoint, which, paired with a dust emission field, allows us to establish high-resolution source contribution maps. We apply FLEXPART to establish source receptor relationships between six loess sites across the CLP and examine the interannual variations in deposition at these over a 20-year period from 1999-2019. In this study, both fine (1.7-2.5 μm) and super-coarse (15-20 μm) dust particles are simulated to better understand whether the deposition of fine particles occurs under the same climate conditions as that of coarse particles and whether the source regions are the same. We chose to study the interannual variation in the dust deposition rate over the CLP because we are interested in understanding the processes responsible for the changes in loess MAR, with implications for identifying the factors that could be driving the changes that have occurred on longer time scales(F. Peng et al., 2022).

2 Model and Data

2.1 FLEXDUST and FLEXPART

FLEXDUST is an offline dust emission model developed to be used in pair with the Lagrangian dispersion model FLEXPART to study the long-range transport and deposition of windblown dust (Groot Zwaaftink et al., 2016). The combination FLEXDUST-FLEXPART has previously been applied to study the sources, transport, and deposition of high-latitude dust (Groot Zwaaftink et al., 2017; Kylling et al., 2018; Wittmann et al., 2017). The dust emitted in FLEXDUST is assumed to have a volume size distribution between 0.2 and 20 μm according to the brittle fragmentation theory described in Kok (2011). Tang et al. (2023) identified several weaknesses in the way dust-emitting areas in East Asia were represented in the original FLEXDUST version. Therefore, we use the updated version of FLEX-DUST by Tang et al. (2023), which includes several changes to better represent present day dust emission areas in East Asia. To avoid confusion with the standard version of FLEXDUST, we refer to the updated Tang et al. (2023) version of FLEXDUST as FLEXDUST-EA. Changes in FLEXDUST-EA compared to FLEX-DUST include: (1) the parameterization of vertical dust flux described by Kok et al. (2014) with a modified parameter for the calculation of the threshold friction velocity according to Shao and Lu (2000), (2) the soil texture dataset in the ISRIC SoilGrids dataset described by de Sousa et al. (2020), (3) new improved topographical erodibility scaling, and (4) herbaceous and crop land cover types in the GLC-NMO land cover dataset are considered to have a potential to emit dust in addition to bare ground and sparse vegetation. For a complete description of the changes in FLEXDUST-EA compared to the standard version, see Tang et al. (2023).

Dust transport and deposition are calculated using FLEXPART version 10.4 (Pisso et al., 2019). FLEXPART is an open source model and has been applied to study the transport of a wide range of atmospheric tracers, such as, mineral dust, black carbon, and volcanic ash (Groot Zwaaftink et al., 2022, 2016; Choi et al., 2020; Eckhardt et al., 2008). FLEXPART calculates the trajectories of a large number of computational particles that are used to describe the transport and deposition of tracers in the atmosphere. This version of FLEXPART includes the improved wet deposition scheme based on cloud information from the ECMWF input fields (Grythe et al., 2017). In addition, FLEXPART accounts for gravitational settling, dry deposition, and in- and below-cloud scavenging of simulated dust aerosols. Dry deposition is treated using a resistance scheme (Stohl et al., 2005) and in-cloud wet deposition distinguishes between scavenging in the liquid and ice phase (Grythe et al., 2017).

FLEXPART can be run both in forward (source-oriented) and backward (receptor-oriented) mode. The model gives the same results when running in forward or backward mode, except for some minor numerical differences (Seibert & Frank, 2004), and therefore the direction can be set for computational efficiency. Since we are interested in mapping the spatiotemporal contribution of different dust-emitting regions to a receptor, we run FLEXPART in backward mode. In the backward configuration, computational particles are released at a predefined receptor location, and then each particle is traced backward in time. The distribution of the residence time of the computational particles in each grid cell of the output grid is used to calculate the emission sensitivity (ES). ES gives a relationship between a potential source in a grid cell and deposition at the receptor. ES is calculated separately for each dust particle size bin and deposition process. We include two size bins in our FLEXPART simulations, corresponding to fine dust (mean diameter $2\mu m$) and super-coarse dust (mean diameter $17.6\mu m$) following the terminology of A. Adebiyi et al. (2023). These two sizes were selected to represent the clay and silt fractions that are typically observed in the Chinese loess. In addition to size, efficiencies for
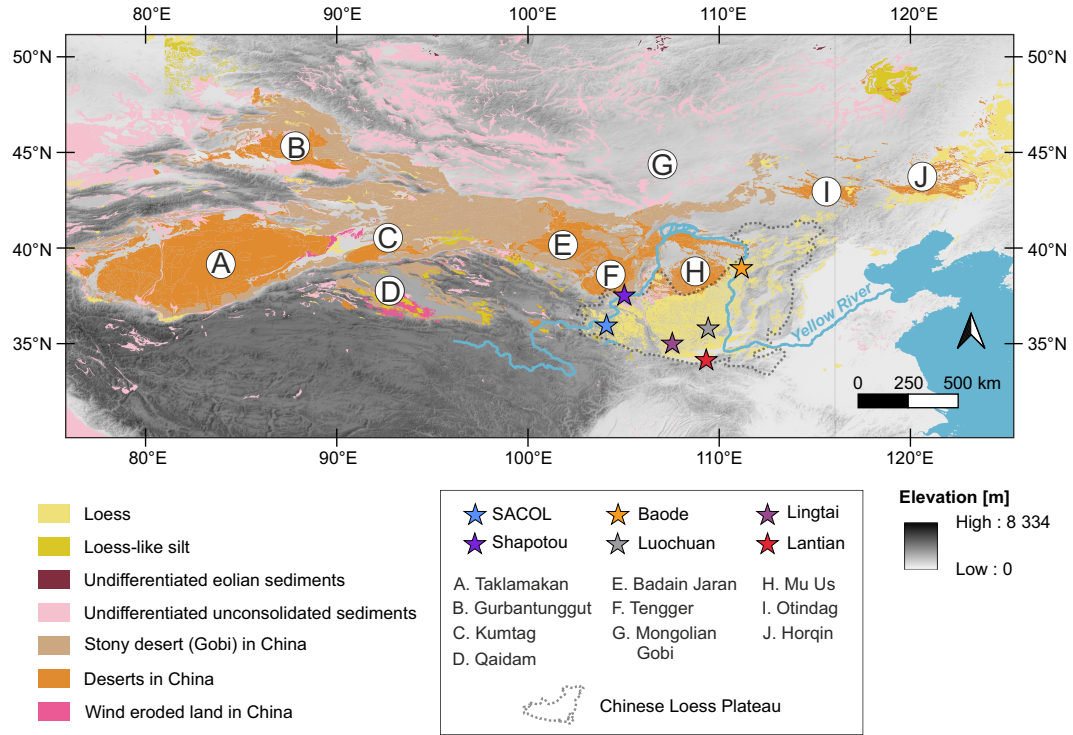
Figure 1. Digital elevation model (Shuttle Radar Topography Mission) and the locations of the Chinese Loess Plateau, the study sites and major dust emitting areas in Central-East Asia. The distribution of loess, loess-like silt, and the undifferentiated sediments are from Börker et al. (2018), and the deserts and wind 477 eroded land in China from 1:200,000 Desert Distribution Dataset provided by the Environmental and Ecological Science Data Center 478 for West China, National Natural Science Foundation of China (http://westdc.westgis.ac.cn; last access 27 July 2020).

each of the wet removal processes can be assigned differently depending on the kind of dust-aerosol represented. The parameters we used to represent the two types of airborne dust particles in our FLEXPART simulations are listed in Table 1. Dry deposition ES is calculated by releasing particles from the receptor at the surface level between 0-30 meters and then calculating the particle backtrajectories. Wet deposition ES is calculated by releasing particles throughout the atmospheric column to determine whether a particle is wet scavenged. Then only backtrajectories of the particles that undergo wet scavenging are calculated. Consequently, to achieve a statistically reliable outcome, a greater number of particles are necessary for wet deposition simulations. ES averaged over a selected output layer height can be multiplied by the dust emission inventory (units kg m^{-3}s^{-1}) created by FLEXDUST, to generate a map that quantifies each contribution of the source element to the deposition at the receptor (Eckhardt et al., 2017). Summing the source contribution (SC) of each source element yields the deposition rate at the receptor.

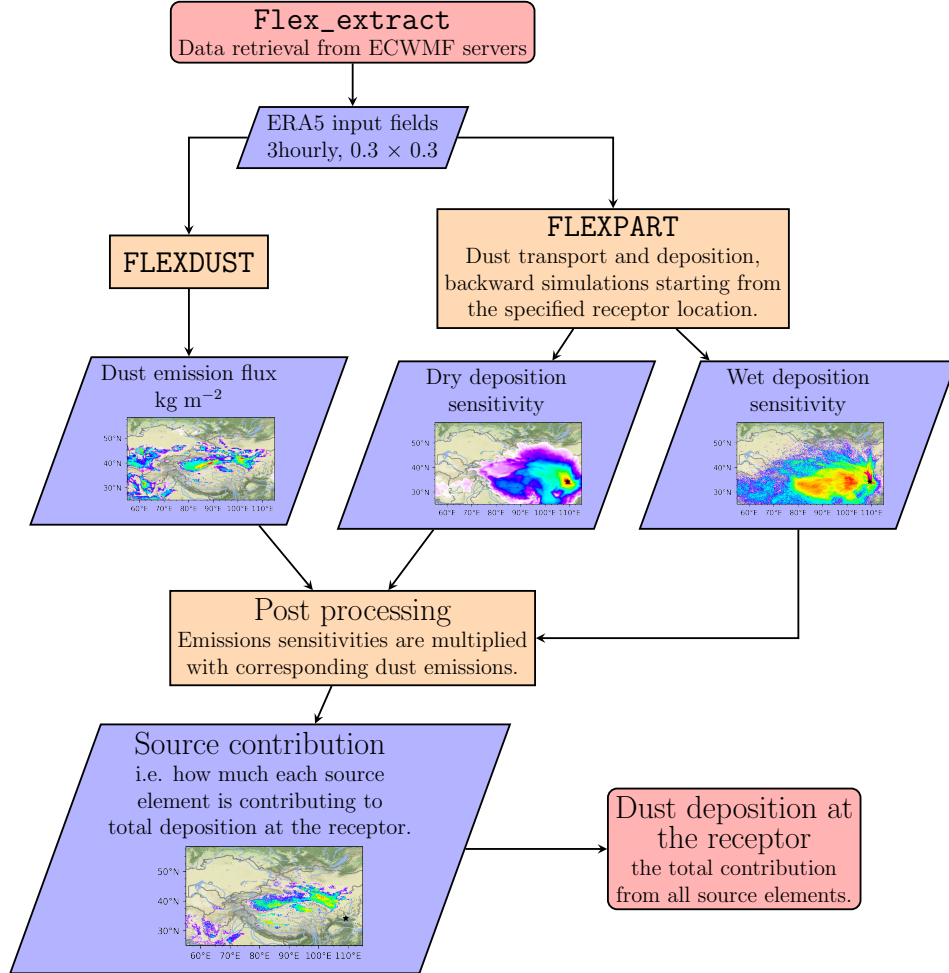## 2.2 FLEXPART backtrajectory set up and workflow

Figure 2. Flow chart showing the workflow for the FLEXPART-FLEXDUST backward trajectory modeling analysis.

²⁴⁶ Backward FLEXPART simulations were performed during the main dust storm
²⁴⁷ season between March 1st and May 31st over a 21-year period from 1999 until 2019
²⁴⁸ for six locations across the CLP shown in Figure 1. The selected sites encompassed
²⁴⁹ both well-established loess sites with historical loess and red-clay deposits (Baode,
²⁵⁰ Luochuan, Lingtai, and Lantian), as well as modern dust observation sites (Shapo-
²⁵¹ tou and SACOL). This diverse geographical selection of sites allows for a compre-
²⁵² hensive assessment of dust deposition susceptibility across different parts of the CLP
²⁵³ to different dust emissions regions and circulation patterns.

²⁵⁴ FLEXPART was configured the following way, every particle release contained
²⁵⁵ either 50,000 or 200,000 particles, depending on whether dry or wet deposition is
²⁵⁶ simulated. Particles within one release are evenly distributed over 3-hourly inter-
²⁵⁷ vals. The extent of the backtrajectories was limited to a maximum particle age of
²⁵⁸ 10 days. ES was calculated with 0.1 degree resolution, with an output grid spanning
²⁵⁹ 50-128°longitude, 25-65°latitude, and stored as 3-hourly averages. The FLEXDUST-
²⁶⁰ EA dust emission flux is multiplied by the averaged ES of 0-100 meters to derive
²⁶¹ the deposition source contribution. The parameters of the two particle size bins that
²⁶² we include are listed in Table 1. We have summarized the stages of the workflow in
²⁶³ Figure 2, commencing with the retrieval and preparation of the forcing data. Then
²⁶⁴ the calculations of dust emissions, dry and wet dust deposition ES are done concur-
²⁶⁵ rently. Finally, the FLEXDUST dust emission inventory is combined with FLEX-
²⁶⁶ PART ES during post-processing to produce the source contribution maps and the
²⁶⁷ deposition rate for each of the receptor locations.

Table 1. FLEXPART species parameters for the fine and super-coarse dust particle size bins.

	Description	Fine	Super-coarse
`PCRAIN_AERO`	Efficency of below cloud scavenging by rain (1=100%, 0=off)	1.00	1.00
`PCSNOW_AERO`	Efficency of below cloud scavenging by snow (1=100%, 0=off)	1.00	1.00
`PCC_AERO`	CCN efficiency (in cloud scavenging)	0.15	0.30
`PIN_AERO`	IN efficiency (in cloud scavenging)	0.02	0.10
`PDENSITY`	Particle density (dry deposition)	$2500.0 \, \mathrm{kg \, m^{-3}}$	$2500.0 \, \mathrm{kg \, m^{-3}}$
`PDQUER`	Mean particle diameter (dry deposition)	$2.057 \, \mu m$	$17.32 \, \mu m$
`PDSIGMA`	Normalized particle diameter deviation	1.21	1.15

²⁶⁸ We used the most recent ECMWF Reanalysis v5 (ERA5) atmospheric forcing
²⁶⁹ dataset in our FLEXPART and FLEXDUST simulations, the dataset is described in
²⁷⁰ Hersbach et al. (2020). We used a regional domain cutout of ERA5 extending from
²⁷¹ 10°E to 160°E and 10°N to 80°N, with a horizontal resolution of 30 km (T639) and
²⁷² 137 vertical levels from the surface up to 0.01 hPa (80 km). ERA5 data were pre-
²⁷³ pared and downloaded from the Copernicus Climate Change Serviced Climate Data
²⁷⁴ Store using the Flex_extract version 7.0.4 Python package (Tipka et al., 2020). All
²⁷⁵ ERA5 data are available for free from the Copernicus Climate Data store.

2.3 Model evaluation

²⁷⁷ Long-term field observations of dust deposition on the CLP suitable for model
²⁷⁸ evaluation do not exist. Hence, we have to depend on aerosol reanalysis to assess
²⁷⁹ the performance of FLEXPART and FLEXDUST-EA. Specifically, we use Modern-
²⁸⁰ Era Retrospective Analysis for Research and Applications, version 2 (MERRA-2)
²⁸¹ aerosol reanalysis produced by NASA's Global Modeling and Assimilation Office

(Gelaro et al., 2017). This dataset has previously been shown reliable at simulating the EADC (H. Liu et al., 2018; W. Yao et al., 2020). Similarly to ERA5, MERRA-2 assimilates essential atmospheric variables such as wind, precipitation, and surface pressure. However, unlike ERA5, MERRA-2 additionally incorporates aerosol optical depth (AOD) retrievals sourced from various ground-based and spaceborne instruments, including the Moderate Resolution Imaging Spectroradiometer (MODIS), the Multiangle Imaging Spectroradiometer (MISR), and the Aerosol Robotic Network (AERONET). Assimilation should bring aerosol loading and AOD in MERRA-2 closer to observations. AOD represents the total aerosol loading but does not provide information on aerosol composition, and therefore the model determines the contribution of dust aerosols to the total AOD. MERRA-2 represent dust aerosols using five size bins (0.1-1.0, 1.0-1.8, 1.8-3.0, 3.0-6.0, and 6.0-10.0 [μm]). Dust emission and deposition are not assimilated in MERRA-2; and are in this regard similar to FLEXDUST relying on the model physics. The wind patterns of MERRA-2 should be similar to those observed in ERA5, however, due to its lower spatial resolution of 0.675 °longitude and 0.5 °latitude, it is not able to capture local-scale winds as accurately as ERA5. This means that MERRA-2 does not necessarily outperform any other dust model (Gelaro et al., 2017; Zhao et al., 2022). For example, Tang et al. (2023) compared FLEXPART for the mega dust storm in spring 2021 with the two most widely used aerosol reanalysis products MERRA-2 and CAMS. The study revealed that FLEXPART exhibited consistency with MERRA-2 with respect to the strength and timing of the event. However, the overall spatio-temporal patterns of total concentration were more in line with CAMS. We still chose to use MERRA-2 as our benchmark because it has a continuous data record dating back to 1980 and covering the entire modeling period of this work.

3 Results and Discussion

3.1 The spatial distribution and interannual variation of the East Asian spring dust cycle

Our setup using FLEXPART coupled with FLEXDUST-EA was developed to represent East Asian sources and Tang et al. (2023) showed that it can realistically simulate the evolution of single dust events, compared to both observations and reanalysis. Here, we evaluated FLEXDUST-EA by comparing it with MERRA-2 over a longer time period. Zamora et al. (2022) have also shown a comparison with MERRA-2 products focusing on the Arctic region, where they found mainly differences based on a lack of high-latitude dust sources in MERRA-2. The spatial distribution of dust emissions in FLEXDUST-EA aligns closely with that of MERRA-2, as illustrated in Figure 3. Both FLEXDUST-EA and MERRA-2 identify key dust emission hot spots in East Asia, including the Taklamakan desert, northwestern deserts, and the Gobi desert, which is consistent with previous studies (Kok et al., 2021; Shi & Liu, 2011; Shao & Dong, 2006; J. Sun et al., 2001). Moreover, FLEXDUST-EA shows a strong correlation with MERRA-2 regarding the interannual variation in spring dust emission across all major source regions. Both models show notably lower dust emissions during the springs of 2005 and 2019 and higher emissions during 2001 and 2004. In addition, the period between 1999 and 2009 has greater variability in dust emissions compared to 2010 to 2019 in both FLEXDUST-EA and MERRA-2.

Next, we evaluate how FLEXPART represents the interannual variation of dust deposition at our sites by comparing the springtime dust deposition simulated by FLEXPART with that of the MERRA-2 grid box closest to our sites. Figure 4a shows the interannual variation of the total spring deposition simulated by FLEXPART versus MERRA-2, comparing the fine dust size bin (mean diameter 2 μm) in FLEXPART with the 1.0-1.8 μm size bin in MERRA-2. The models correlate
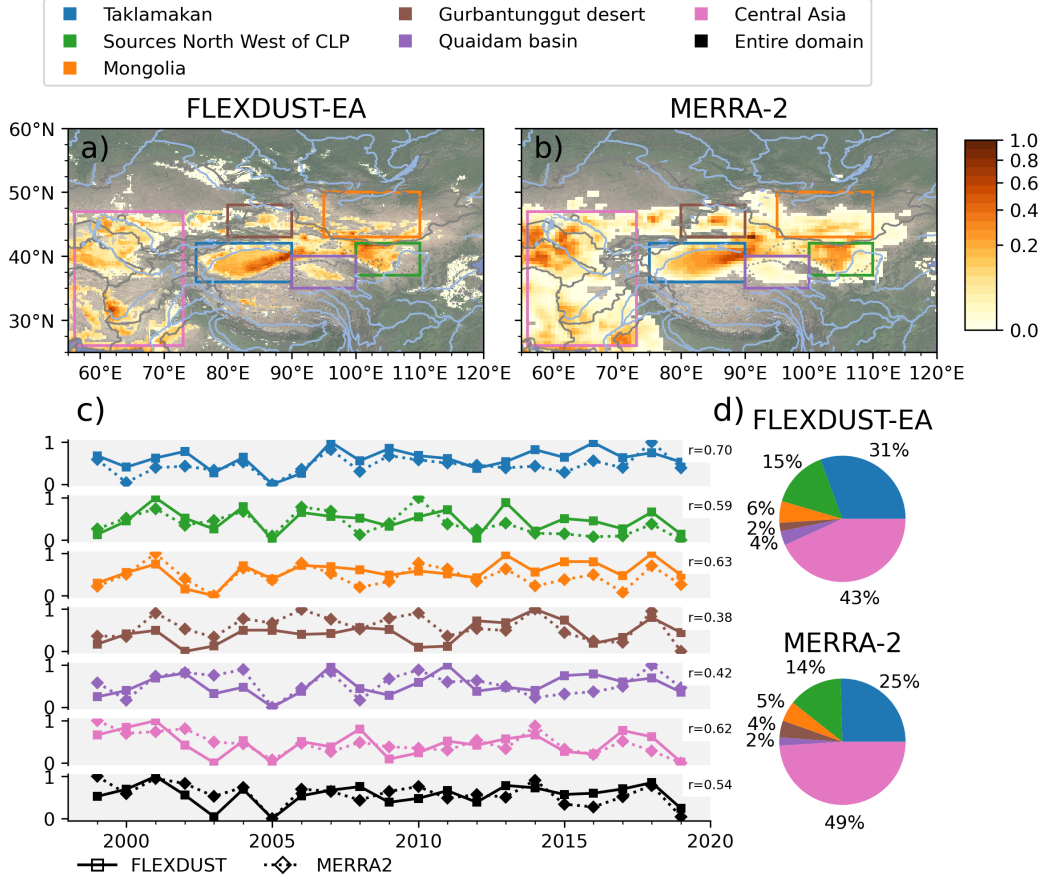
Figure 3. Normalized mean spring dust emissions **(a)** FLEXDUST and **(b)** MERRA-2 between 1999 and 2019. The following dust-emitting regions are indicated: Taklamakan (blue, A), Qaidam Basin (purple, D), sources northwest of CLP (green, E,F,H), Mongolia (orange, G,I), Gurbantunggut Desert (brown, B) and Central Asia (pink), the letters correspond to dust emission regions named in Figure 1. **(c)** Normalized timeseries of spring dust emissions FLEXDUST (solid line) and MERRA-2 (dotted line), numbers in the upper right corners show the correlation coefficient. **(d)** The relative dust emission strength of each source region.
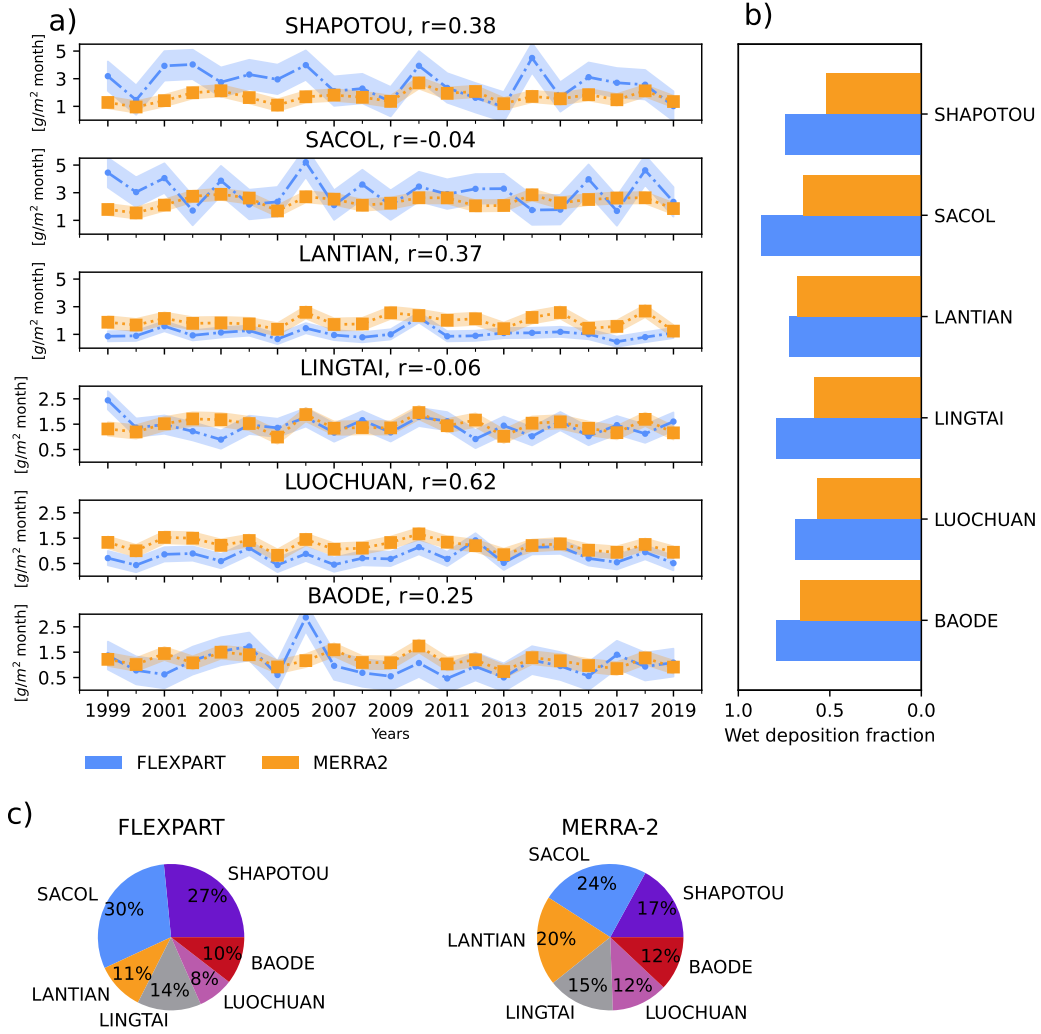
Figure 4. **(a)** Inter-annual variation of total spring deposition simulated by FLEXPART (blue) and MERRA-2 (orange) of the fine dust particle size bin (FLEXPART mean diameter 2.057 μm,size bin 2 in MERRA-2, 1.0-1.8 μm) for each of the sites at the CLP. The envelope indicates one standard deviation. **(b)** The ratio of wet deposition to total deposition at each receptor site. The blue bar is FLEXPART and orange bar is MERRA2.**(c)** Relative distribution of dust deposition between the receptor sites in FLEXPART and MERRA-2.

well for Luochuan, Lantian, and Shapotou, but FLEXPART and MERRA-2 are not correlated at SACOL and Lingtai. SACOL and Lingtai are located close to the mountains in a region with complex topography, which is not well resolved by typical model grids. Additionally, accurately representing precipitation in mountainous regions poses a significant challenge, and different reanalysis datasets may have substantial variation in their precipitation rates (J. Yao et al., 2020). Moreover, SACOL and Lingtai experience a high proportion of wet deposition, as shown in Figure 4b, making the differences in precipitation events between ERA5 and MERRA-2 a potential source of reduced correlation. There is a greater correlation in the dry deposition rate between MERRA-2 and FLEXPART for all sites (see Figure S1) than in wet deposition. In addition, the wet deposition has a larger interannual variation in FLEXPART compared to MERRA-2. Consequently, wet deposition amplify the differences between FLEXPART and MERRA-2 to total deposition. Finally, modeling dust (wet) deposition is an overarching problem in current dust models, with models showing large differences in the relative importance of wet to dry deposition (Zhao et al., 2022; Huneeus et al., 2011).

FLEXPART and MERRA-2 also show differences in the spatial distribution of dust deposition throughout the CLP (Figure 4c). MERRA-2 has a smaller spatial difference in dust deposition throughout the CLP, while in FLEXPART the two sites close to the source regions make up more than 50% of the combined deposition of our sites. Our set-up with backward trajectories limited to 10 days and the comparison of relatively larger sized particles in FLEXPART to smaller particles in MERRA-2 can both contribute to this model inconsistency, but it is also related to the longer lifetime in MERRA-2 compared to FLEXPART (Tang et al., 2023).

Although conducting a detailed investigation of the differences in the representation of the EADC in FLEXPART and MERRA-2 is outside the scope of this study. Still, our initial assessment has revealed that the interannual variation in dust emissions in FLEXDUST-EA shown in Figure 3 aligns well with that of MERRA-2, particularly for the important source regions in East Asia. However, total dust deposition over the CLP in FLEXPART is not consistent with MERRA-2 at all sites, mainly due to differences in the occurrence of wet deposition events. Evaluating the representation of dust deposition in both MERRA-2 and FLEXPART poses challenges due to the limited constraints available on dust deposition in East Asia and the rudimentary nature of dust deposition parameterization in models (X. Zhang et al., 2019).

3.2 Springtime dust transport to the Chinese Loess Plateau: wet versus dry deposition

Figure 5 shows the 20-year averaged spring source contribution maps for each site and both dust particle sizes. The source contribution is normalized by the mean contribution, enabling a relative comparison of the influence of different sources, independent of the deposition rate at the site. The pie chart represents the relative contribution of the source regions as defined in Figure 3 to the total deposition at the site.

Across all CLP locations, Figure 5 shows that the predominant source region that accounts for the majority of dust deposition is the deserts northwest of the CLP. Depending on the site, this source contributes between 48% and 78% of the fine dust and between 47% and 88% of the super-coarse dust. In particular, the source contribution of super-coarse dust in Figure 5 shows a higher contribution from nearby sources compared to fine dust. Fine dust shows a gradual transition from the primary dust sources to less influential ones as one moves away from the receptor location on the source contribution map. The relative source contributions
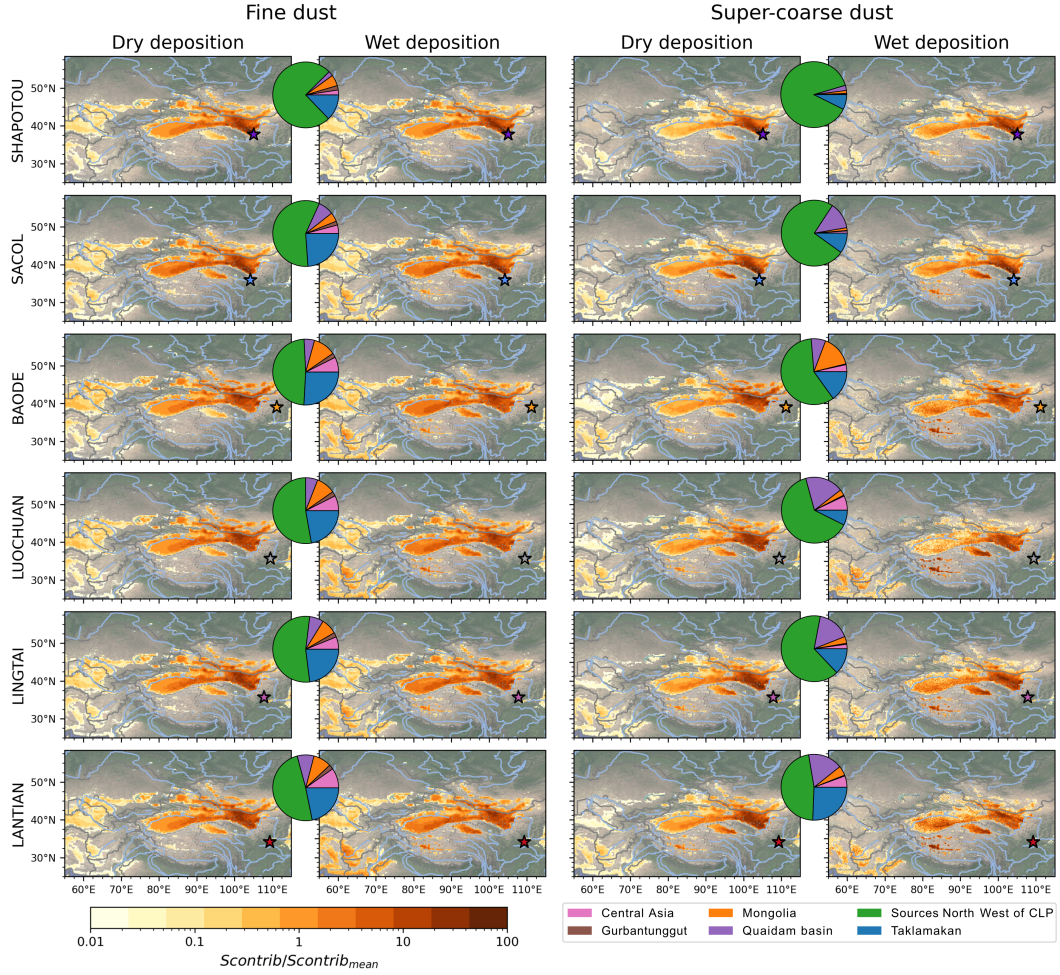
Figure 5. Averaged spring dust source contribution (1999-2019) of dry- and wet deposition scaled by the mean contribution. The pie chart shows the contribution from each of the source regions as defined in Figure 3.

of fine dust at our CLP locations shown in Figure 5 are consistently similar. For example, at Baode, Luochuan, Lingtai, and Lantian, the order of importance of the different source regions remains consistent: (1) Northwest deserts, (2) Taklamakan, (3) Mongolia, (4) Central Asia, (5) Qaidam Basin, and (6) Gurbantunggut desert. Even at SACOL and Shapotou, which have more distinct source contributions, the main difference lies in an increased contribution from the northwestern dust sources.

In contrast, the source composition of super-coarse dust displays more distinct patterns at each location. For instance, super-coarse dust from Shapotou originates primarily from the nearby desert to the northwest of the CLP, with only a minor contribution from Taklamakan. Baode experiences a substantial influx of super-coarse dust from Mongolia, a source nearly absent at other sites. Another notable aspect of super-coarse dust is the trend of increasing influence of dust from the Qaidam Basin across the southeast transect of the CLP. Although the Qaidam Basin contributes modestly to emissions, it becomes the second most influential source at SACOL, Luochuan, Lingtai, and third at Lantian. Central Asia and the Gurbantunggut desert, although not primary sources of dust to the CLP, however, are not negligible at certain sites. For instance, Central Asia contributes to 6-7% of the super-coarse dust deposited at Lingtai and Lantian, emphasizing how even larger dust particles from distant dust emission regions can impact the CLP.

The difference between the dry and wet deposition source contribution is shown in Figure 5. The source contributions of wet and dry deposition of fine dust are mostly similar except for dry deposited dust being more influenced by the northwestern sources, whereas wet deposition has a stronger influence from the more distant sources. On the other hand, the source contribution of wet deposited super-coarse dust noticeably diverges from the sources of dry deposited dust. The wet deposition source contribution displays a more noisy pattern, indicating less frequent occurrences of wet deposition for super-coarse dust. The larger variability of the wet-deposited super-coarse dust translates into a more erratic spatial pattern in the wet deposition source contribution compared to the relatively robust pattern observed for dry deposition.

The source contribution maps presented in Figure 5 represent the cumulative effects of emissions, transport, and deposition. To pick out the general dust transport routes to the CLP, we take the centroid trajectory of all the particles released within each 3-hourly particle release and combine them into one dust transporting trajectory by calculating the center of mass of all the trajectories over the whole period weighted by the deposition rate modeled at the time of release. The dust transport trajectories for all sites and for dry and wet deposition are shown in Figure 6. In the case of fine dust, the trajectories demonstrate minimal variation between receptor locations, consistent with relatively uniform source contribution maps across the different sites. Conversely, for super-coarse dust, the transport patterns of dry-deposited dust closely resemble those of dry-deposited fine dust, primarily exhibiting a prevailing northwesterly transport (Figure 6 a, b). An exception is observed for SACOL, displaying a more westerly transport, in alignment with the substantial contribution from the Qaidam Basin. Wet deposition of super-coarse dust exhibits significant variability in transport trajectories between receptors, contributing to the site-dependent nature of super-coarse dust source contributions. A common trend across all sites is that wet-deposited dust is generally influenced by southerly airmasses, resulting in overall westerly transport. Given that the source of moisture originates from the south, this pattern is reasonable. Furthermore, the trajectories show an increase in altitude as they approach the receptor, indicating that wet-deposited dust typically experiences uplift due to convection initiated by the typical cold air advection observed during a dust event.
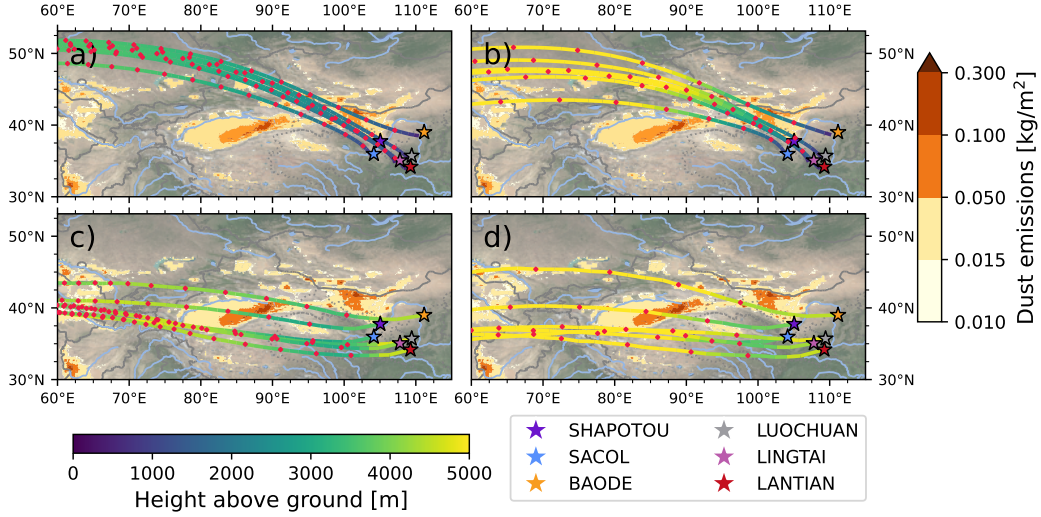
Figure 6. Weighted average centroid dust loading trajectories by the deposition rate at the receptor at the time of arrival. **(a)** and **(b)** are dry deposition dust loading trajectories for fine (mean diameter 2.057 μm) and super-coarse dust (mean diameter 17.32 μm) particles. **(c)** and **(d)** wet deposition dust loading trajectories for the fine and super-coarse dust respectively. The mean height is along the trajectory shown by the coloring and the red dots along the trajectories are equally spaced 12hours apart. The shading underneath show the mean dust emission rate.

Wind speed only changes the mass emitted for dust up to 20 μm, but does not change the size distribution at emissions (Kok, 2011). Therefore, the variations in source contribution between fine and super-coarse dust primarily stem from differences in their lifetimes. In FLEXPART, we changed two parameters that control dust particle lifetime: the wet scavenging efficiency (assumed to be size-dependent) and the particle size that governs the dry deposition velocity. The impact of different gravitational settling can be seen from the difference in the source contribution between dry-deposited fine and super-coarse dust. To keep the super-coarse dust in the air sufficiently long enough to reach the CLP, either the wind speed has to be sufficiently strong such that the dust arrives before it falls out or the dust has to experience vertical lifting to counter the gravitational settling.

Topography has been proposed to increase vertical dust transport. Heisel et al. (2021) utilized high-resolution large-eddy simulations to demonstrate that gently sloping terrain can substantially amplify vertical dust transport. The source contribution maps of wet-deposited super-coarse dust showed a distinct band of higher contribution along the southern edge of the Taklamakan. Additionally, it is important to observe that this band of intensified source contribution is less prominent in the source contribution maps for dry deposition, suggesting that this phenomenon cannot be solely attributed to heightened emissions along the southern boundary. Moreover, similar to the Taklamakan, the Qaidam Basin, a source surrounded by sloping terrain, is also a substantial source of wet-deposited super-coarse dust. Hence, potentially suggesting that when super-coarse dust ascends to higher atmospheric levels, it becomes scavenged within the cloud and falls out with the precipitation. Particles of this size readily activate as Cloud Condensation Nuclei (CCN) and rapidly grow to raindrop size. Consequently, a substantial amount of coarse dust could potentially accelerate precipitation onset, mitigating the tendency

of continental air with high concentrations of CCN to produce numerous small cloud droplets (Posselt & Lohmann, 2008).

In summary, there are two prominent pathways for dust transport. The first pathway exhibits a prevailing northwesterly direction, gathering dust primarily from the northwestern desert regions. This pattern is strongly associated with the dry deposition of dust on the CLP. Conversely, the second dust transport pathway, linked to wet deposition, follows a more westerly trajectory. Along this route, topographical features drive dust to higher atmospheric levels, where it is then scavenged within the clouds and subsequently washed out over the CLP.

3.3 Drivers of interannual variations in EADC

Table 2. Definition of the climatic indices used in the correlation analysis.

Indices	Definition	Reference
Arctic Oscillation (AO)	Leading EOF of the 1000hPa geopotential height anomalies poleward of 20°N	Thompson and Wallace (1998)
East Asian Winter Monsoon intesity index (EAWMI)	Difference in area averaged 300hPa zonal winds U_{300}(27.5°-37.5°N, 110°-170°E)-U_{300}(50°-60°N, 80-140°E)	Jhun and Lee (2004)
Monsoon Index (MO)	Difference in MSLP between two grid points (105°E, 52.5°N) near Irkutsk and (145°E, 43.75°N) near Nemuro.	Sakai and Kawamura (2009)
Siberian High intensity index (SHI)	Area averaged MSLP (40°-65°N, 80°-120°E)	Wang and Chen (2010)
East Asian Temperature Gradient (EATG)	Gradient in zonally averaged temperature between 30°- 120°E, and taken the averaged gradient between 40°and 50°N	J. Liu et al. (2020)

In the following, we utilize the FLEXPART simulations to examine the factors driving the interannual variations in the spring EADC over the past 21 years from 1999 to 2019. We establish correlations between dust emission and deposition and various climatic variables representing different aspects of the East Asian circulation. The indices that we used, along with their definitions, are summarized in Table 2. All indices are calculated from monthly ERA5 data for both winter (December-February) and spring (March-May). Decadal trends are removed from the time series before calculating the correlations to aviod the influence of low-frequency climate variations.

The correlations of the winter and spring circulation with spring dust emissions are shown in Figure 7b,c. Figure 7b shows that the circulation of the preceding winter has a significant impact on the frequency and intensity of dust storms in spring. Emissions from the northwestern deserts are anticorrelated with winter AO. As evident in Figure 5 in the previous section, this is the most significant dust source for the CLP. Interestingly, winter AO does not significantly affect emissions from other source regions. Instead, Taklamakan emissions are negatively correlated with the winter monsoon and are most strongly correlated with the Siberian High Intensity Index (SHI), suggesting that the location and strength of the SH are important factors that regulate dust emissions in the Taklamakan desert. Qaidam emissions have correlations similar to those of Taklamakan, albeit weaker. Emissions from Central Asia and Gurbantunggut are not strongly related to the winter circulation of East Asia. For the spring circulation shown in Figure 7c, dust emissions in Mongolia and
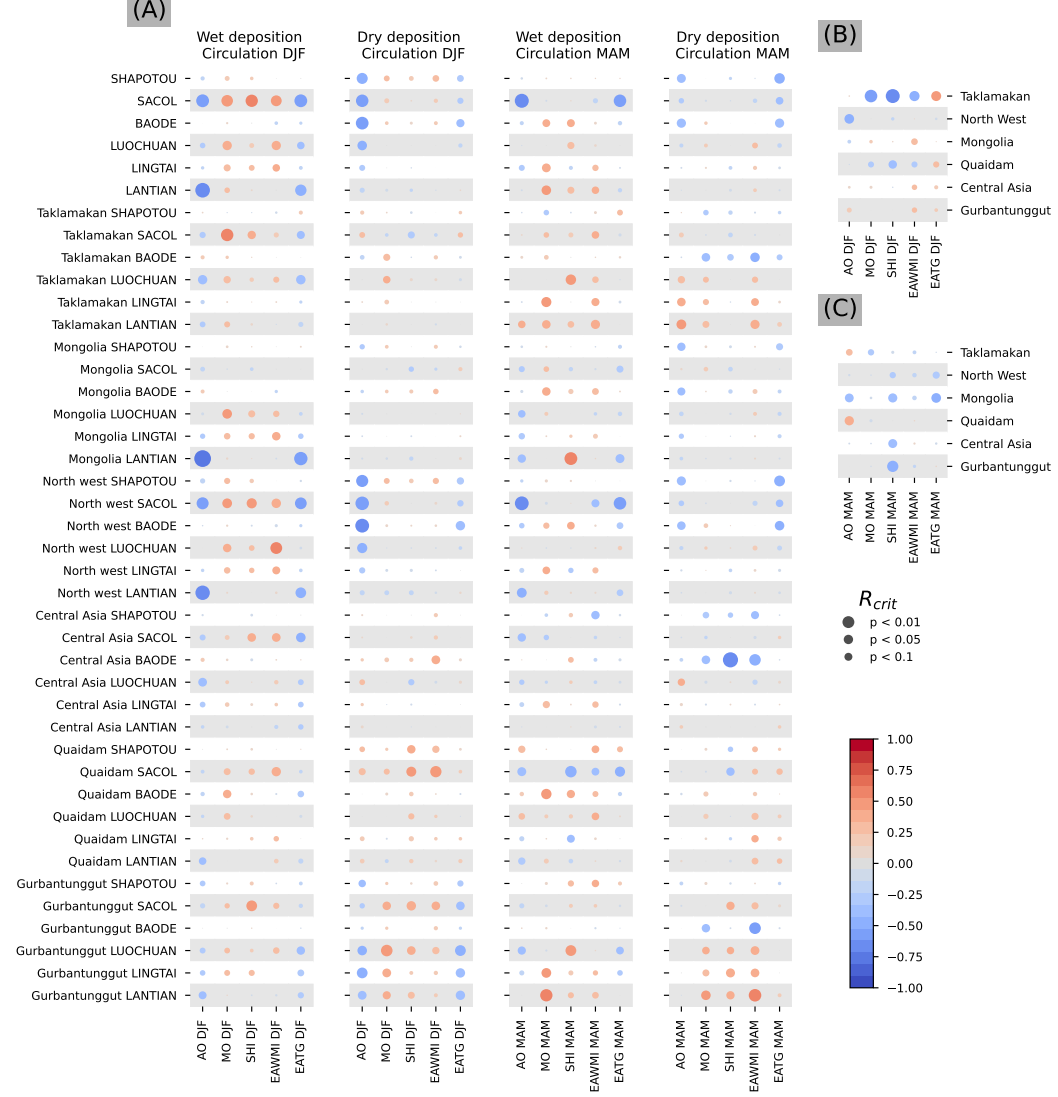
Figure 7. **(a)** Correlations between winter (December-January-February, DJF) and spring (March-April-May, DJF)circulation indices and modeled spring dry- and wet deposition of super-coarse dust, for the whole domain and contributions from individual source regions. **(b-c)** Correlation with FLEXDUST-EA dust emissions in the source regions and with winter and spring circulation respectively. The size of the circle indicate the strength of the correlation.

northwestern deserts are more strongly correlated with the magnitude of the East Asian Temperature Gradient (EATG), that is, a large negative temperature gradient favors larger emissions. Taklamakan emissions do not show a significant correlation with any particular spring circulation index. Qaidam is similar again to Taklamakan except that it is more positively correlated with AO. The intensity of the SH in spring is significantly anti-correlated with emissions from Central Asia and Gurbantunggut.

Figure 7a shows the correlations between source contributions of super-coarse dust, delineated by contributions from each dust emission region to each site. Looking at the winter circulation, we observe significant negative correlations between the AO and dry deposition at Shapotou, SACOL, Baode, and Luochuan. Additionally, AO is negatively correlated with wet deposition at Lantian and SACOL. The correlations with AO are most pronounced for source contributions from Mongolia and the northwestern deserts, although they vary by site.

Interestingly, wet deposition at SACOL demonstrates significant correlations with all winter circulation indices, including AO and MO, both of which are linked to the EATG. Additionally, the SHI correlates with both AO and MO, even though AO and MO do not exhibit a significant correlation with each other (see Supplement Figure S3). Considering these insights, we infer that, for wet deposition at SACOL, the strength of EATG in winter plays a critical role in creating favorable conditions for wet deposition in spring, mainly sourced from the northwestern deserts. However, for dry deposition at SACOL, AO is the only significantly correlated index, aligning with AO's correlation with emissions from the northwestern sources, the primary dust source for SACOL.

The strength of the EAWM is correlated with dust from Qaidam and Gurbantunggut to the SACOL site. The spring EAWM circulation features are correlated with an increased contribution from the Gurbantunggut desert to Lantian, Lingtai, and Luochuan. The deposition of Central Asian dust at the sites is generally not correlated with any of the circulation indicators, except at Baode site, which shows a significant negative correlation between the contribution of dry deposited dust from Central Asia and the SHI, where the SH can act as a barrier for long-range dust transport.

The correlations presented above are for the super-coarse dust size bin. Fine dust correlations are provided in the Supplement (Figure S4). The correlations between the winter AO circulation and spring deposition remain consistent across fine and super-coarse dust. However, in terms of spring circulation, the two particle sizes are less consistent. Dry-deposited fine dust displays notably higher correlations with EATG and EAWMI, especially for dust transport from Taklamakan compared to super-coarse dust. For the north western deserts fine and super-coarse dust exhibit similar correlations with EATG. The correlations between circulation patterns and wet deposition for fine dust are highly variable and strongly dependent on the site, and this does not change from what is shown in Figure 5. This underscores that wet deposition is the result of an intricate dynamic between the source, receptor, and circulation modes.

To interpret the relationship between atmospheric circulation patterns and dust deposition over the CLP, as revealed in the previous correlation analysis shown in 7, we performed a composite analysis of years with weak and strong deposition at sites, to identify site-dependent circulations features that typically cause an increase in dust deposition. Figure 8 shows the composite differences of 850hPa winds and mean sea level pressure (MSLP), hatched areas show the regions where the differences between the strong and weak dust deposition years are significant. In the case of dry deposition of super-coarse dust, all sites manifest AO-like composite dif-
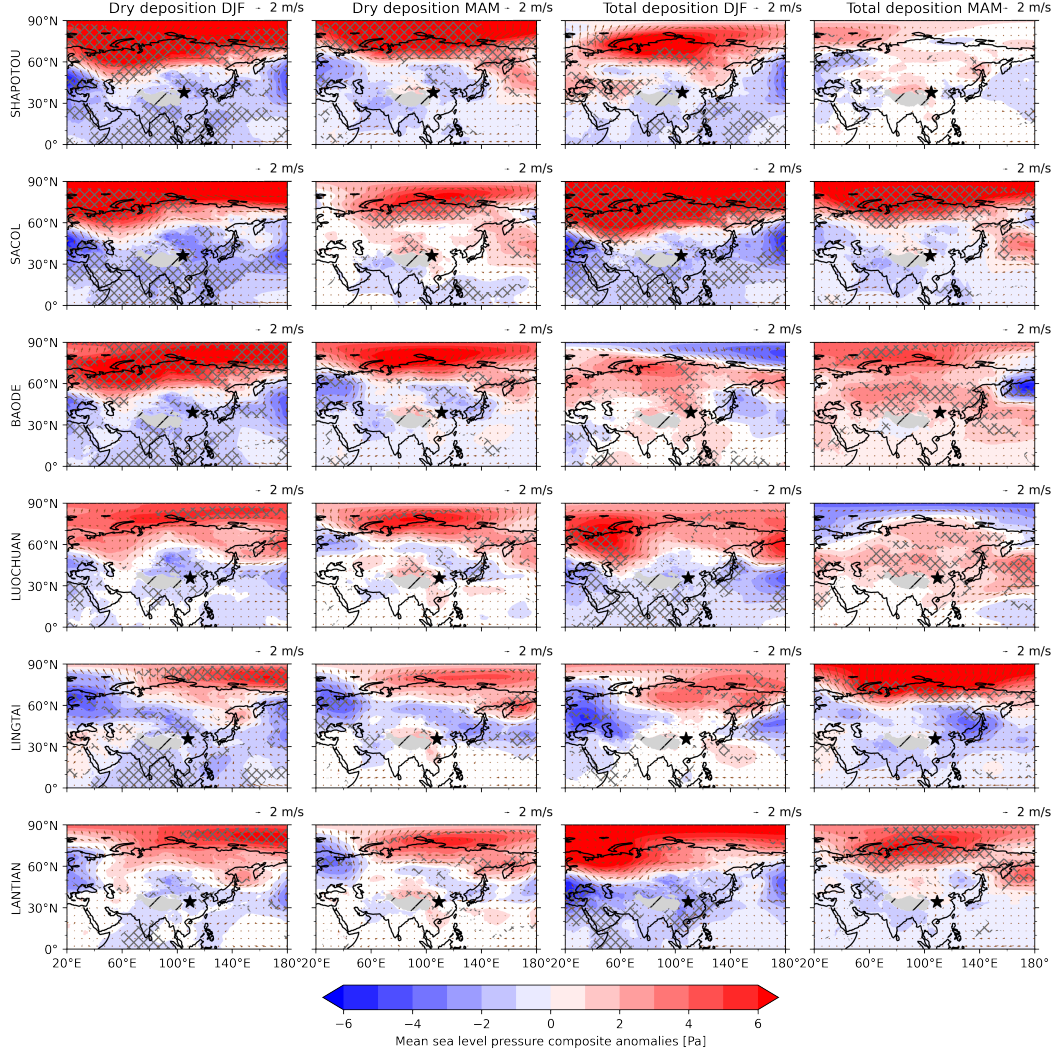
Figure 8. Composite difference of mean sea level pressure and 850hPa wind strong minus weak deposition years for super coarse dust for both winter (December-January-February, DJF) and spring (March-April-May, MAM) for all the locations. The left half shows composite difference based on dry deposition rate, while the right half is the composite difference based on total deposition rate. The hatched area indicates where the anomalies are significant (p < 0.05)

ferences during the winter preceding a strong deposition year. These anomalies show characteristic positive MSLP anomalies over the Arctic, typical of negative AO-like conditions (Thompson & Wallace, 1998; He et al., 2017). This AO-like pattern extends into the spring for most sites. However, for total deposition at Shapotou and Luochuan, the AO pattern is masked by other influences, as wet deposition is more event-dependent and less influenced by the overarching circulation state. A longer time series of simulations would be able to better distinguish the more random fluctuations due to wet deposition from the impact of large-scale circulation.

Figure 9 shows the composite anomalies of the geopotential height and winds at 500hPa for super-coarse dust. During the winter preceding a strong deposition year, it indicates an area of reduced geopotential height that for Lantian, Lingtai, Luochuan and Baode is located to the north west of the site, while for Shapatou and SACOL negative geopotential height anomaly is located more to the north east. This suggests that increases in dust deposition as a result of dry deposition at these sites are closely associated with the location of this geopotential height anomaly and the corresponding changes in the wind patterns.

During the negative phase of AO, there is usually an increase in the frequency and intensity of cold air outbreaks (COAB) in East Asia (He et al., 2017; Yang et al., 2020). H. Liu et al. (2018) conducted a detailed analysis investigating the relationship between spring dust emissions and the preceding winter AO using MERRA-2 reanalysis. Using regression analysis, they revealed a correspondence between winter 500 hPa geopotential height and the leading empirical orthogonal function of spring dust emissions, similar to the composite anomalies we found shown in Figure 9. H. Liu et al. (2018) suggested that a negative AO results in anomalous cold conditions in central Siberia, which persist into the ensuing spring, amplified by snow-albedo and cloud feedbacks. The resultant colder temperatures in the inner regions of East Asia create a more negative temperature gradient in the region, intensifying the East Asian Trough (EAT). This in turn creates a favorable environment for dust emissions. Their explanation of how winter AO influences spring surface temperature aligns with our correlation analysis, where a negative AO corresponds to a more pronounced temperature gradient over East Asia, elevating dust transport to the CLP from the northwestern sources.

3.4 Implications for interpreting Chinese Loess Plateau dust records

Our results reveal a clear link between the depositional mechanism and the dust-emitting regions. This observation may have major implications on how we interpret the provenance of the CLP dust records (Quaternary loess and Neogene red clay) also on geological time scales. The CLP dust provenance studies often consider changes in emission and transport mechanisms, but commonly overlook the final step of the EADC, the deposition. Our results on the deposition of both fine and super-coarse particles indicate that wet deposition contains more dust from western emission areas than dry deposition (Figure 6), suggesting the shift in CLP dust provenance may not only be related to changes in dust transport pathways but also the deposition mode. The CLP dust records are associated with coarser grain sizes during glacials compared to interglacials. These differences have been explained by higher dust influx and reduced soil development coupled with stronger wind speeds during glacial periods (Maher, 2016; Kohfeld & Harrison, 2003). However, our results imply that increased wet deposition of fine/clay-sized dust during the wetter interglacials could provide an additional explanation for the observed grain-size differences between glacials and interglacials. Similarly, the finer grain size of late Neogene red clay deposits compared to Quaternary loess may be associated with an increase in the wet deposition of finer particles during intensified EASM conditions (Ren et al., 2020; Z. L. Ding et al., 1999).
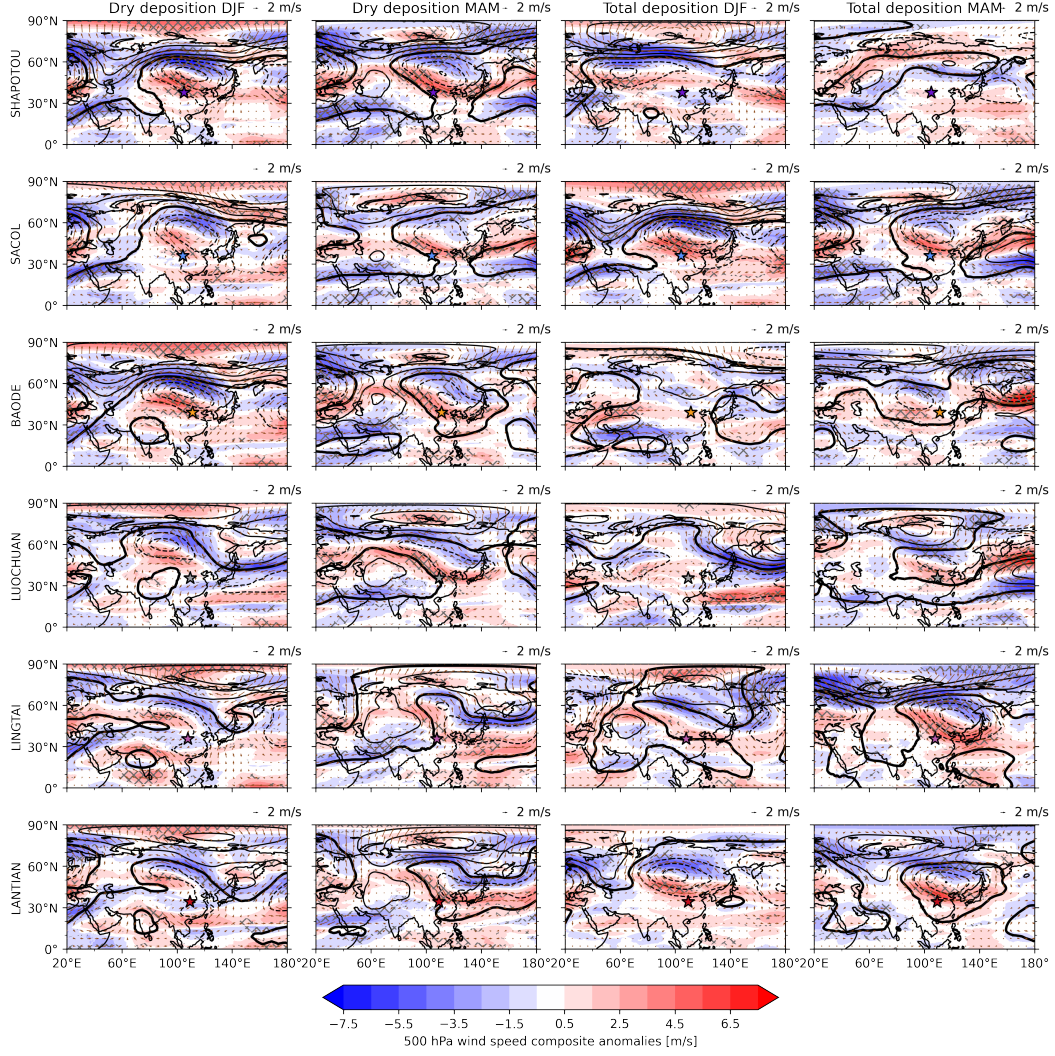
Figure 9. Circulation composite anomalies of 500hPa wind strength (colored, unit m/s), wind direction (vectors, unit m/s) and geopotential height (contours, unit dam, distance between contours 2 dam, solid contour are positive anomalies while dotted contours are negative anomalies) for winter (December-January-February, DJF) and spring (March-April-May, DJF) of strong - weak dry and total deposition years. The hatched area indicates where the anomalies are significant (p < 0.05)

The results of our model, which covers the full dust cycle (i.e., emission, transport, and deposition), may also have important implications on the observed spatial differences in source contribution across the CLP. Previous single-grain provenance studies (targeting silt-sized particles) have documented Neogene and Quaternary dust source differences between the northeastern (e.g., Baode site) and the southwestern (e.g., Lantian) CLP (Shang et al., 2016; H. Zhang et al., 2021; W. Peng et al., 2023; Bird et al., 2015). These observations were supported by backward trajectory modeling showing more dominant atmospheric transport pathways from the Taklamakan desert and Northern Tibetan Plateau to the southwestern CLP than to the northeastern CLP (Shang et al., 2016). The results of our model, taking into account the full EADC, further corroborate these conclusions (Figure 5). In addition, spatial differences in dust provenance have been found to be particularly prominent in coarse dust particles and wet deposited dust (Figure 5). This offers a plausible eolian mechanism for explaining the spatial provenance contrast of the red clay and loess deposits, and its temporal variations, in addition to the well-established hypothesis emphasizing the importance of large fluvial systems (namely the Yellow River) in providing dust particles closer to the CLP, and therefore in creating the observed spatial provenance gradient (Stevens et al., 2013; Bird et al., 2015; Nie et al., 2015; W. Peng et al., 2023; H. Zhang et al., 2021 ;Sun et al., 2022). For instance, W. Peng et al. (2023) found an increase in Pliocene spatial provenance contrast in the Red Clay, and argued that this was partly caused by the intensified Pliocene EASM. This argument is well in line with our results, since the intensified EASM can enhance the wet deposition flux over the CLP. Therefore, an increase in wet deposition can act to amplify the spatial provenance differences created primarily by the fluvial input of material.

Our modeling results with super-coarse/silt-sized dust particles indicate that even large dust particles deposited on the CLP may be sourced from distant dust-emitting sources (e.g., Taklamakan) although they are not the dominant contributor to the deposition on the CLP. Larger dust particles (super-coarse or larger) deposited far from the dust emission region have also been reported in recent observational studies (Van Der Does et al., 2018; Ryder et al., 2018; A. A. Adebiyi & Kok, 2020). The fact that we also find reason to believe that super-coarse dust deposited over the CLP can be from the distant dust-emitting regions provides additional support to the validity of the single-grain provenance proxy studies using mainly the large mineral particles in detecting the source origin of emitted dust. Strengthening claims and insights on loess formation mechanisms and climatic implications made based on the coarse dust fractions in the loess deposits. We note that spherical particles are assumed in our model simulations, thus might be considered a lower bound of the long-distance transport of super-coarse dust to the CLP. Further modeling studies using a-spherical particles with lower settling velocities and potentially longer transport distance than spherical particles may help to better understand the long-distance transport of large dust particles.

The interannual variation of the spring dust deposition rate over the CLP has been found to be more closely associated with AO than with the strength of the EAWM in both winter and spring (Figure 7 and S4). This is distinct from the common understanding within the paleoclimate communities which emphasizes the importance of EAWM in regulating the dust cycle over the CLP (e.g. An et al., 2014). However, consistent with studies of the present-day interannual variation of the EADC, which generally support the strong control of AO instead of EAWM on the variation of EADC (Mao et al., 2011; H. Liu et al., 2018), with the negative AO being favorable for stronger dust storms in East Asia. Although the results are based on the annual time scale, they may have strong implications for understanding long-term changes in the EADC and the interpretation of the red clay and loess record, especially when it is difficult to use the strength of EAWM to explain the dust records

and its variations. For instance, provenance research on the dust records deposited during the warmhouse Eocene indicates the absence (or significantly weaker) SH coupled with possible long-term negative phase of AO -like conditions (Bohm et al. 2023X, in revision). Moreover, it has been noticed that the cyclicity of the oxygen isotopes of speleothem records over East Asia, an indicator of East Asian summer monsoon, is dominated by precession cycle (20 ka) on orbital time scale, which is in contrast to the loess records, which reveal a dominance of the glacial-interglacial cycle (100 ka) (Cheng et al., 2021). The larger influence of AO-like conditions (over EAWM) on the variation of dust deposition over the CLP during the glacial-interglacial cycle, may offer a plausible explanation of the "apparent" discrepancy between loess and speleothem records from East Asia. This explanation is consistent with the fact that high-latitude forcing is the dominant influence on Loess records (Stevens et al., 2018). However, on the basis of this work, it is not possible to conclude whether this is generally the case because the climatic conditions during the glacial stages are very different from those of today. Although, this could be answered by driving this modeling setup using data from paleoclimate simulations in the future.

4 Conclusion

To our knowledge, this is the first modeling study to provide a detailed picture of how proximate and distant dust emission areas contribute to dust accumulation on the CLP. We provide evidence for the importance of considering wet deposition when interpreting the loess records, showing that wet-deposited dust differs in both the typical transport trajectory and the source of the emitted dust. Even super-coarse dust could be wet deposited at the CLP where sloping topography upwind of dust emission area can act to increase the vertical dust transport substantially, making it possible for even large dust particles to be scavenged inside clouds. This could be an important mechanism for bringing potentially non-negligible amounts on of coarse dust particles from more distant sources like the Taklamakan desert and Quaidam basin. Dry-deposited dust is mainly sourced from the nearby dust-emitting areas to the north-west of the CLP, this transport pathway is favorable under negative AO-like conditions. That the AO is an important driver of the EADC is in line with our understanding of the EADC under present day climate conditions (H. Liu et al., 2018; Mao et al., 2011; D.-Y. Gong et al., 2006). This study provides a direct link between AO and dust accumulation on the CLP. Our link between AO and dust accumulation on the CLP was established based on current climate conditions, which were different in the past, but it does warrant a stronger emphasis on high-latitude forcings when explaining the variability in dust accumulation rate of the loess record rather than the common partitioning of enhanced summer monsoon or winter monsoon conditions, as also suggested by Roe (2009).

FLEXPART has also been shown to be a very useful tool for understanding the dust cycle, as it can pinpoint the exact dust source contribution of a receptor site. The FLEXPART ES is independent of the dust emission inventory, so FLEXPART can be used to easily test the effect and impact of different emission schemes and hypothesis of changes in dust emission regions in the past. A promising future application of this setup would be to combine FLEXPART and state-of-the-art paleoclimate model reconstructions to give insight into how environmental changes have influenced the source region and dust transport mechanism at the CLP. This would be invaluable in formation to further aid in interpretation of the CLP provenance proxies and help to understand how the EADC might change in the future.

Acronyms

CAOB Cold air outbreaks

EAWM East Asian Winter Monsoon

CLP Chinese Loess Plateau

AO Arctic Oscillation

LPDM Lagrangian particle dispersion model

MAR Mass accumulation rate

EOF Empirical orthogonal functions

MSLP Mean sea level pressure

DJF December January February

MAM March April May

EADC East Asian dust cycle

ES Emission sensitivity

SHI Siberian High Intensity index

EATG East Asian Tempereature Gradient

MO Monsoon index

Acknowledgments

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