



1 **Vehicle-based in-situ observations of the water vapor isotopic**
2 **composition across China: spatial and seasonal distributions and**
3 **controls**

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21 Abstract

22 Stable water isotopes are natural tracers in the hydrological cycle and have been applied
23 in hydrology, atmospheric science, ecology, and paleoclimatology. However, the factors
24 controlling the isotopic distribution, both at spatial and temporal scales, are debated in East
25 Asia. For the first time, we made large scale (order 10000 km) continuous observations of near-
26 surface vapor isotopes across China in both pre-monsoon and monsoon seasons, using a newly-
27 designed vehicle-based vapor isotope monitoring system. For both seasons, the observed
28 variations along the sampling route are mainly due to spatial variations, and marginally
29 influenced by synoptic-scale variations. The data thus documents the spatial and seasonal
30 variability of vapor isotopes. The spatial variations of vapor $\delta^{18}\text{O}$ are mainly controlled by
31 Rayleigh distillation during the pre-monsoon period, but significantly influenced by different
32 moisture sources, continental recycling processes and convection during moisture transport
33 during the monsoon period. The seasonal variation of vapor $\delta^{18}\text{O}$ reflects the influence of the
34 summer monsoon convective precipitation in southern China, and a dependence on temperature
35 in the North. The spatial and seasonal variations in d-excess reflect the different moisture
36 sources and the influence of continental recycling. The isotope-incorporated global spectral
37 model (Iso-GSM) successfully captures the spatial variation of vapor $\delta^{18}\text{O}$ during the pre-
38 monsoon period owing to the large latitudinal contrast in humidity and temperature, the overall
39 performance is weaker during the monsoon period. These results provides an overview of the
40 spatial distribution and seasonal variability of water isotopic composition in East Asia and their
41 controlling factors, and emphasize the need to interpret proxy records in the context of the
42 regional system and moisture sources.

43 **Keywords:** Vapor isotopes, Spatial distribution, Seasonal difference, East Asia, Moisture
44 sources, Moisture propagation

45 1. Introduction

46 Isotopic equilibrium and kinetic fractionation produce a natural labeling effect within the
47 global water cycle. Stable water isotopes have thus been applied to study a wide range of
48 hydrological and climatic processes (Gat, 1996; Bowen et al., 2019; West et al., 2009). Stable
49 isotopic signals recorded in natural precipitation archives are used in the reconstructions of
50 ancient continental climate and hydrological cycles due to their strong spatial relationship with
51 local meteorological conditions. Examples include ice cores (Thompson, 2000; Yao et al.,
52 1991; Tian et al., 2006), tree-ring cellulose (Liu et al., 2017), stalagmites (Van Breukelen et al.,
53 2008), and lake deposits (Hou et al., 2007). However, unlike in polar ice cores, isotopic records
54 in Tibetan ice cores (Thompson et al., 1997) have encountered challenges as temperature
55 proxies (Brown et al., 2006). Recent advances in understanding controls on precipitation and
56 ice core isotopes in Asian monsoon regions highlight the significant role of large regional
57 atmospheric circulation, e.g. El Niño/Southern Oscillation and Interdecadal Pacific Oscillation
58 Index (Cai and Tian, 2016; Yang et al., 2016; Vuille and Werner, 2005). The controlling factors
59 of water isotopes in low-latitude regions also differ with the time scales (e.g., Shi et al.(2020)).
60 Additional data and analysis refining our understanding of controls on the spatial and temporal



61 variation of water isotopes in low-latitude regions such as East Asia therefore are needed.

62 Unlike precipitation, water vapor enters all stages of the hydrological cycle, experiencing
63 frequent and intensive exchange with other water phases, in particular, directly linked with
64 water isotope fractionation. Furthermore, vapor isotopes can be measured in regions and
65 periods without precipitation, and therefore, have significant potential to trace how water is
66 transported, mixed, and exchanged (Galewsky et al., 2016; Noone, 2008), and to diagnose large-
67 scale water cycle dynamics. Water vapor isotope data have been applied to systems ranging
68 from the marine boundary layer to continental recycling, from tropical convection to polar
69 climate reconstructions (Galewsky et al., 2016).

70 The development of laser-based spectroscopic isotope analysis made the precise, high-
71 resolution and real-time measurements of both vapor $\delta^{18}\text{O}$ and $\delta^2\text{H}$ available in recent decades.
72 However, most of the in-situ observation are station-based (e.g., Li et al.(2020), Tian et
73 al.(2020), Steen-Larsen et al.(2017)), or performed during ocean cruises (Thurnherr et al.,
74 2020; Bonne et al., 2019; Jingfeng Liu et al., 2014; Kurita, 2011; Benetti et al., 2017). These
75 observations provided new insight on moisture sources, synoptic influences, and sea surface
76 evaporation fractionation processes. Few observations are available over the continent, where
77 moisture sources are more complex (Bailey et al., 2013). To go one step further, continuous
78 monitoring of near-surface vapor isotopes at broad continental scales would support research
79 on how large-scale circulation and synoptic processes affect spatial and seasonal variations in
80 isotopic composition.

81 This paper presents a unique and novel isotope dataset consisting of vehicle-based
82 spatially continuous near-surface vapor isotopes across a large spatial scale in China during the
83 pre-monsoon and monsoon periods. The data provide a detailed description of the spatial and
84 seasonal variability of vapor isotopes and their controlling mechanisms in the middle and low
85 latitudes. Our results reveal two types of isotopic patterns: (1) spatial variations at the regional
86 scale for a given season, and (2) synoptic-scale variations that locally disturb the seasonal-mean
87 variations. To disentangle these two effects and their causes, we exploit simulations from the
88 isotope-incorporated global spectral model (Iso-GSM). Collectively, these data and analyses
89 provide refined understanding of how the interaction of the summer monsoon and westerly
90 circulation control water isotope ratios in East Asia.

91 **2. Data and methods**

92 **2.1 Geophysical description**

93 China has a typical monsoon climate (Wang, 2002; Domrös and Peng, 2012). Large parts
94 of the country are affected by the Indian monsoon and the East Asian monsoon in summer
95 (Fig.1), which bring humid marine moisture from the Indian Ocean, South China Sea, and
96 Northwestern Pacific Ocean. During the non-monsoon seasons, the Westerlies influence most
97 of northern China (Fig.1). Dry intrusion brings extremely cold and dry air masses. Occasional
98 moisture flow from the Indian Ocean and/or Pacific Ocean brings moisture to southern China.
99 This seasonal patterns of water vapor transport are also imprinted in the observed precipitation
100 isotopes (Araguás-Araguás et al., 1998; Tian et al., 2007; Wright, 1993; Mei'e et al., 1985; Tan,
101 2014).



We conducted two campaigns to monitor vapor isotopes across a large part of China during the pre-monsoon (3rd to 26th March, 2019) and the monsoon (28th July to 18th August, 2018) periods, using a newly designed vehicle-based vapor isotope monitoring system (Fig.S1). The two campaigns run along almost the same route, with slight deviation in the far northeast of China (Fig.1). Our vehicle started from Kunming city in southwestern China, traveled northeast to Harbin, then turned to northwestern China (Hami), and returned to Kunming. The expedition traversed most of eastern China, with a total distance of above 10000km for each campaign.

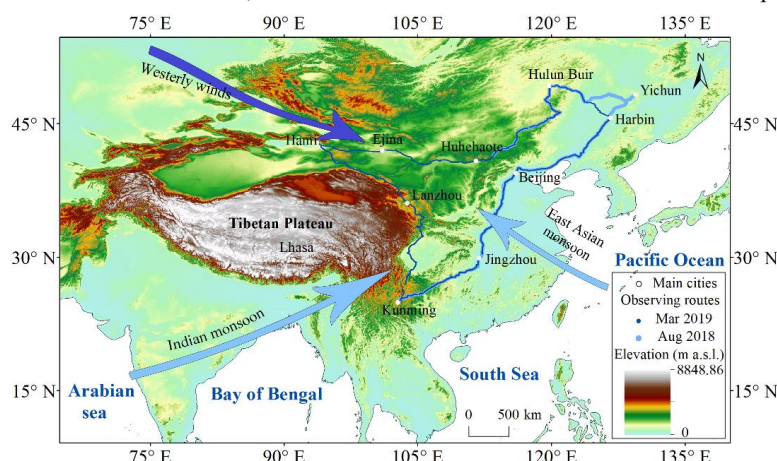


Fig.1. Topographical map of China, showing survey routes and the main atmospheric circulation systems (arrows). Dark blue dots indicate the observation route for the 2019 pre-monsoon period, and light blue dots show the observation route for the 2018 monsoon period, with a slight deviation in the northeast.

2.2 Vapor isotope measurements

2.2.1 Isotopic definitions.

Isotopic compositions of samples were reported as the relative deviations from the standard water (Vienna Standard Mean Ocean Water, VSMOW), using the δ -notation (McKinney et al., 1950), where R_{sample} and R_{VSMOW} are the isotopic ratios ($\text{H}_2^{18}\text{O}/\text{H}_2^{16}\text{O}$ for $\delta^{18}\text{O}$, and $^1\text{H}^2\text{H}^{16}\text{O}/\text{H}_2^{16}\text{O}$ for $\delta^2\text{H}$) of the sample and of the VSMOW, respectively:

$$\delta = (R_{\text{sample}}/R_{\text{VSMOW}} - 1) \times 1000 \quad (1)$$

The second-order deuterium excess parameter are computed based on the commonly used definition (Dansgaard, 1964):

$$\text{d-excess} = \delta^2\text{H} - 8 \times \delta^{18}\text{O} \quad (2)$$

2.2.2 Instrument

We used a Picarro 2130i CRDS water vapor isotope analyzer fixed on a vehicle to obtain continuous measurements of near-surface vapor isotopes along the route. The analyzer was powered by a lithium battery on the vehicle, enabling over 8 hours operation with a full charge. Therefore, we only made measurements in daytime and recharged the battery at night. The ambient air inlet of the instrument was connected to the outside of the vehicle, which was 1.5 m above ground, with a waterproof cover to keep large liquid droplets from entering. A portable



GPS unit was used to record position data along the route. The measured water vapor mixing ratio and the $\delta^{18}\text{O}$ and $\delta^2\text{H}$ were obtained with a temporal resolution of ~ 1 second. The dataset present in this study had been averaged to a 10-min temporal resolution after calibration, with the horizontal footprint of about 15 km.

A standard delivery module (SDM) was used for the vapor isotope calibration during the surveys. The calibration protocols consists of humidity calibration (section 2.2.3), standard water calibration (section 2.2.4), and error estimation (section 2.2.5), following the methods of Steen-Larsen et al.(2013).

2.2.3 Humidity calibration

The measured vapor isotopes are sensitive to air humidity (JingfengLiu et al., 2014;Galewsky et al., 2016), which vary substantially across our sampling route. Hence, we develop a humidity calibration by measuring a water standard at different water concentration settings using the SDM. We define a reference level of 20,000 ppm of vapor humidity for our analysis (Eq. 3), the calibrated vapor isotope with different air humidity would be:

$$\delta_{\text{-humidity calibration}} = \delta_{\text{-measured}} - f(\text{humidity}_{\text{measured}} - 20000) \quad (3)$$

where $\delta_{\text{-measured}}$ represents the measured vapor isotopes (the raw data), $\delta_{\text{-humidity calibration}}$ denotes the calibrated vapor isotopes, f is the calibrated humidity correction term, and humidity is in ppm.

We performed the humidity calibration before and after each campaign. In the calibration, the setting of humidity covered the actual range of humidity in the field. In the dry pre-monsoon period of 2019, the humidity was less than 5000 ppm along a large part of the route. In this case, we performed additional calibration tests with the humidity less than 5000 ppm after the field observations to guarantee the accuracy of the calibration results. The humidity-dependence calibration function is considered constant throughout each campaign (which each lasted less than 24 days).

2.2.4 Measurement normalization

All measured vapor isotope values were calibrated to the VSMOW-SLAP scale using two laboratory standard waters ($\delta^{18}\text{O} = -10.33\text{‰}$ and $\delta^2\text{H} = -76.95\text{‰}$, $\delta^{18}\text{O} = -29.86\text{‰}$ and $\delta^2\text{H} = -222.84\text{‰}$) covering the range of the expected ambient vapor values. We made the normalization test prior to the daily measurements (two humidity levels for each standard water). We adjusted the amount of the liquid standard injected everyday to keep the humidity of the standard waters consistent with the outside vapor measurements. Our calibration shows that no significant drift of the standard values were observed over time in the observation periods.

2.2.5 Error estimation

We estimate the uncertainty based on the error between the measured (after calibration) and true values of the two standards used during the campaigns. The estimated uncertainty is in the range of $-0.05\sim 0.17$ for $\delta^{18}\text{O}$, $0.11\sim 1.19$ for $\delta^2\text{H}$, and $-0.81\sim 1.23\text{‰}$ for d-excess during the pre-monsoon period of 2019, with the humidity ranges from 2000 ppm to 29000 ppm. During the monsoon period of 2018, the range of uncertainty is $-0.10\sim 0.55\text{‰}$ for $\delta^{18}\text{O}$, $-0.94\sim 3.74\text{‰}$ for $\delta^2\text{H}$, and $-1.18\sim 1.49\text{‰}$ for d-excess, with the humidity ranges from 4000 to 34000 ppm.

2.2.6 Data processing

A few isotope measurements with missing GPS information were excluded from the



analysis. Since we want to focus on large-scale variations, we also removed the observations during raining or snowing, to avoid situations where hydrometeor evaporation significantly influenced the observations (Tian et al., 2020). Such data represents only 0.03% and 0.05% of our observations, respectively (totally 48 data during pre-monsoon season and 59 data during the monsoon season). We observed several d-excess pulses with extremely low values as low as -18.0% during the pre-monsoon period and -4.9% during the monsoon period. These low values are unusual in previous natural vapor isotope studies and occurred mostly when the measurement vehicle was entering or leaving cities and/or stuck in traffic jams. We assume these abnormal data are significantly influenced by fuel combustion (Gorski et al., 2015), and we also excluded these data (133 data points during the pre-monsoon period and 62 data points during the monsoon period, represents 0.10% and 0.06% of our observations, respectively) in the discussion on the general spatial feature (except Fig.2). Alternatively, we add a short discussion about this influence specifically in section 4.8.

2.3 Meteorological observations and back-trajectory calculation

We fixed a portable weather station on the roof of the vehicle to measure air temperature (T), dew-point temperature (T_d), air pressure (Pres) and relative humidity (RH). All sensors were located near the ambient air intake. The specific humidity (q) of the near-surface air was calculated from the measured T_d and Pres. Meteorological data, GPS location data and vapor isotope data were synchronized according to their measurement times.

National Centers for Environmental Prediction/ National Center for Atmospheric Research (NCEP/NCAR) 2.5-deg global reanalysis data are used to determine the large-scale factors influencing the spatial pattern of the vapor isotopes, including the surface T, q, U-wind and V-wind, and RH, which are available at <https://psl.noaa.gov/data/gridded/data.ncep.reanalysis.surface.html>. Some missing meteorological data (during the pre-monsoon period: q on 8th March and 18th March 2019; during the monsoon period: T and q from 28th July to 31st July, q on 5th August) along the survey routes due to instrument failure are acquired from the NCEP/NCAR reanalysis data. To match the vapor isotope data along the route, we linearly interpolate the NCEP/NCAR data to the location and time of each measurement. The interpolated T and q from NCEP/NCAR are highly correlated with our measurement as shown in Figure 2h and j. The precipitation amount (P) from the Global Precipitation Climatology Project (GPCP) are used (<https://www.ncei.noaa.gov/data/global-precipitation-climatology-project-gpcp-daily/access/>). The outgoing longwave radiation (OLR) data can be obtained from NOAA (http://www.esrl.noaa.gov/psd/data/gridded/data.interp_OLR.html).

To trace the geographical origin of the air masses, we select the driving locations every 2 hours as starting points for the backward trajectories, and make 10-day back-trajectories from 1000 m above ground using the Hybrid Single Particle Lagrangian Integrated Trajectory Model 4 (HYSPLIT4) model (Draxler and Hess, 1998). The T, q, P and RH along the back-trajectories are also interpolated by HYSPLIT4 model. The HYSPLIT-compatible meteorological dataset of the Global Data Assimilation System (GDAS) is used (available at <ftp://arlftp.arlhq.noaa.gov/pub/archives/gdas1/>).



217 2.4 General circulation model simulation

218 To first validate the simulation results of the isotope-enabled general circulation model
 219 (GCM) on spatial and seasonal scale during our observation periods, and finally to disentangle
 220 the spatial and synoptic influence, we use surface layer variables from the Iso-GSM simulations
 221 (Yoshimura and Kanamitsu, 2009), which has a latitude resolution of 1.915° and a longitude
 222 resolution of 1.875° . When interpolating daily/temporal-mean outputs, we select the nearest
 223 Iso-GSM grid point for a given latitude, longitude and date/time periods of each measurement.
 224 Because of the coarse resolution of the model, there is a difference between the altitude
 225 observed along the sampling route and that of the nearest grid point. Therefore, we correct the
 226 outputs of iso-GSM for this altitude difference (the method is given in III. Supplementary Text).

227 3 Results

228 3.1 Spatial variations

229 Our survey of the vapor isotopes yields two snapshots of the isotopic distribution along
 230 the route. The observed temporal variations along the route for a given period represent a
 231 mixture of synoptic-scale perturbations, and of seasonal-mean spatial distribution. In section
 232 4.7, simulation results will show that the contribution of seasonal-mean spatial variations
 233 dominate. Therefore, the temporal variations observed along the route for a given period mainly
 234 reflect spatial variations.

235 Figure 2 shows the variations of observed 10-min averaged surface vapor $\delta^{18}\text{O}$ and d-
 236 excess along the survey route across China during the pre-monsoon and monsoon campaigns.
 237 The figure also shows the concurrent meteorological data from the weather station installed on
 238 the vehicle and the water vapor content recorded by the Picarro water vapor isotope analyzer
 239 as a comparison. We extract daily precipitation amount (P-daily) and temporal-mean
 240 precipitation amount for the sampling dates (P-mean) (mm/day) from GPCP. The vapor $\delta^{18}\text{O}$
 241 shows high magnitude variations in both seasons. A general decreasing-increasing trend
 242 overlapped with short-term fluctuations is observed during the pre-monsoon period, whereas
 243 no general trend but frequent fluctuations characterized the monsoon period. The $\delta^{18}\text{O}$ range is
 244 much larger during the pre-monsoon period (varying between -44‰ and -8‰) than during the
 245 monsoon period (from -11‰ to -23‰). Most measured vapor d-excess values ranges from 5 to
 246 25‰ during the pre-monsoon period and from 10 to 22‰ during the monsoon period.

247 Comparison with the concurrently observed meteorological data shows a robust air
 248 temperature (T) dependence of the vapor $\delta^{18}\text{O}$ variations. In particular, the general trend of $\delta^{18}\text{O}$
 249 is roughly consistent with T variation during the pre-monsoon period (Fig.2a and g). During
 250 the pre-monsoon period, humidity (Fig.2e and i), P-mean (Fig.2k) and vapor $\delta^{18}\text{O}$ (Fig.2a) are
 251 much higher in southwestern China (at the beginning and end of the campaign) than in any
 252 other regions. Humidity, q, and P-mean also vary consistently throughout the route during the
 253 monsoon period (Fig.2f, j, l). Synoptic effects on the observed vapor isotopes are discussed in
 254 detail in Section 4.3.

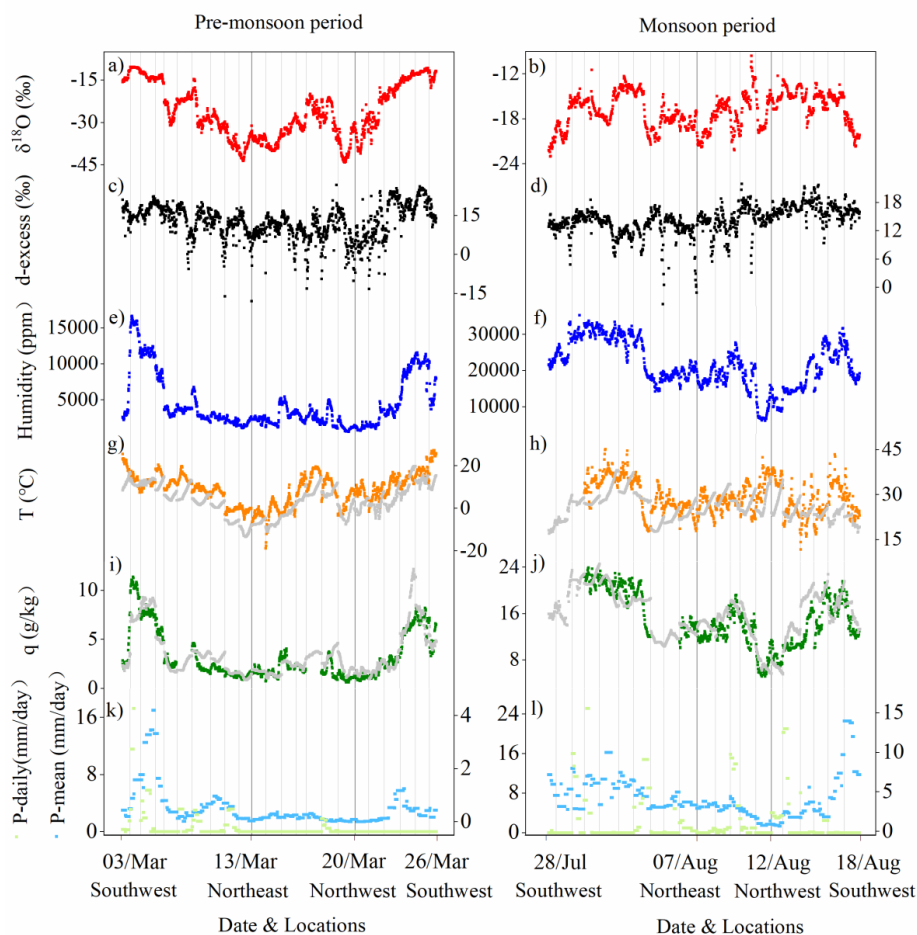


Fig.2. Measured vapor isotopic compositions and concurrent meteorological conditions along the survey routes during the pre-monsoon period (the left panel) and monsoon period (the right panel). (a, b) vapor $\delta^{18}\text{O}$ (‰); (c, d) vapor d-excess (‰); (e, f) vapor humidity (ppm); (g, h) air temperature T ($^{\circ}\text{C}$); (i, j) specific humidity q (g/kg), (k, l) the daily precipitation amount P -daily (mm/day) and temporal-mean precipitation amount for the sampling dates P -mean (mm/day) extract from GPCP. Notes: the gray dots are T and q linearly interpolate from NCAR reanalysis to compensate for missing observations; Gray vertical lines space the observations for one day.

The spatial distribution of the observed vapor $\delta^{18}\text{O}$ and d-excess during the two surveys in different seasons are presented in Figure 3. During the pre-monsoon period, we find a south-north gradient of vapor $\delta^{18}\text{O}$ (Fig.3a). The vapor $\delta^{18}\text{O}$ ranges from $-8 \sim -16\text{‰}$ in southern China to as low as $-24 \sim -44\text{‰}$ in the North. Temperature also shows a strong spatial dependence during this period with relatively warm conditions in southern China and cold in the North (Fig.S2 a). The apparent “temperature effect”, wherein low local temperatures and low water isotope values are correlated, has also been widely reported in studies of precipitation isotopes in the non-monsoon season in China (Zhao et al., 2012; Liu et al., 2014; Johnson and Ingram,



2004). A roughly similar spatial pattern is observed for the vapor d-excess during the pre-monsoon period (Fig.3c). The d-excess value ranges from 10 to 30‰ in southern China and from -10 to +20‰ (most observations with values from 5 to +20‰) in northern China. In previous studies, a higher precipitation d-excess during the pre-monsoon period was also observed in the Asian monsoon region owing to the lower relative humidity (RH) at the surface in the moisture source region (Tian et al., 2007; Jouzel et al., 1997). The same reason probably explains the higher vapor d-excess in southern China observed here. The lower d-excess values (as low as -10‰ to 10‰) in northern China (between 38°N and 51°N) have rarely been reported in earlier studies. The spatial distribution of the observed vapor d-excess could reflect the general latitudinal gradient of d-excess observed at the global-scale, with a strong poleward decrease in midlatitudes (between around 20 to 60°), which were found in previous studies on large-scale distribution of d-excess in vapor (Thurnherr et al., 2020; Benetti et al., 2017) and precipitation (Risi et al., 2013a; Terzer-Wassmuth et al., 2021; Pfahl and Sodemann, 2014; Bowen and Revenaugh, 2003), based on both observations and modelling.

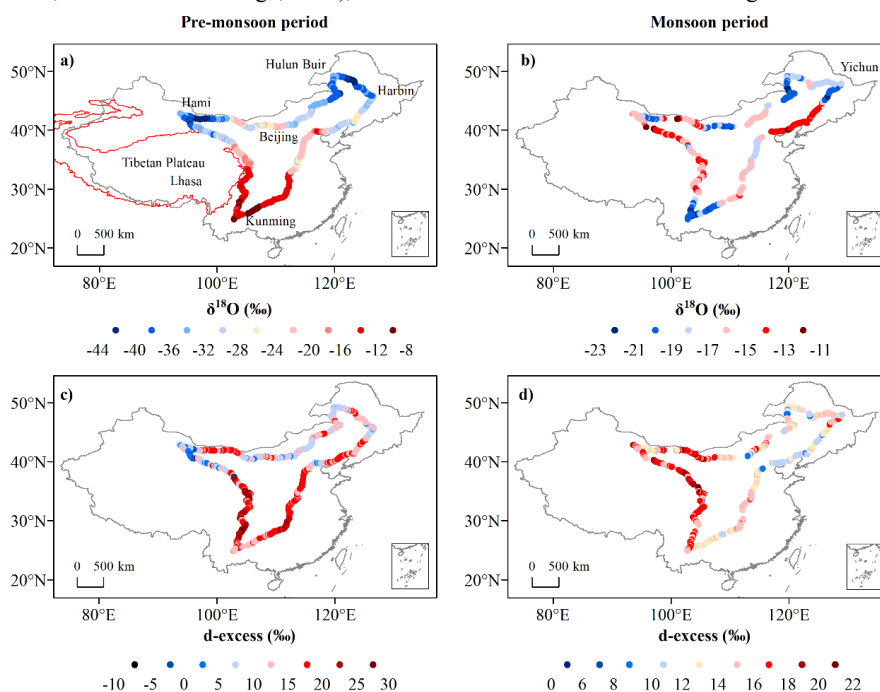


Fig.3. Spatial distribution of vapor $\delta^{18}\text{O}$ (a, b) and d-excess (c, d) during the pre-monsoon period (the left panel) and monsoon period (the right panel).

During the monsoon period, the lowest values of vapor $\delta^{18}\text{O}$ are found in southwestern and northeastern China, with a range of -23‰ to -19‰ (Fig.3b). Higher vapor $\delta^{18}\text{O}$ values up to -11‰ are founded in central China. The vapor d-excess values (Fig.3d) in western and northwestern China (91°E-109°E, 24°N-43°N) are roughly between 16 and 22‰, higher than in eastern China (mostly between 0 and 16‰).



3.2 Seasonal variations

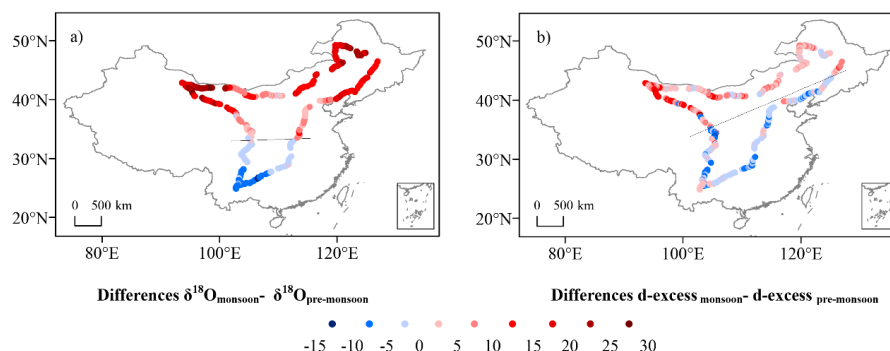


Fig.4 Spatial distribution of the isotope differences ($\delta^{18}\text{O}_{\text{monsoon}} - \delta^{18}\text{O}_{\text{pre-monsoon}}$ (a) and $d\text{-excess}_{\text{monsoon}} - d\text{-excess}_{\text{pre-monsoon}}$ (b)) for the observation locations. The solid black lines separate the areas of positive and negative values of the differences.

The climate in China features strong seasonality and it is captured in the snapshots of vapor isotopes (Fig.4). Since the observation routes of the two surveys are almost identical, we make a seasonal comparison of the observed vapor isotopes during the two surveys. The lines are drawn to distinguish between positive and negative values of seasonal isotopic differences. The seasonal differences $\delta^{18}\text{O}_{\text{monsoon}} - \delta^{18}\text{O}_{\text{pre-monsoon}}$ (Fig.4a) show opposite sign in northern and southern China. In northern China, water vapor $\delta^{18}\text{O}$ values are higher during the monsoon period than during the pre-monsoon period, while the opposite are true in southern China. The boundary is located around 35°N . The largest seasonal contrasts occur in southwest, northwest and northeast China, with seasonal $\delta^{18}\text{O}$ differences of -15 ‰, 30 ‰, and 30 ‰, respectively.

We also find a spatial pattern of vapor d-excess seasonality (Fig.4b), the separation line of the seasonal variation of d-excess coincides with the 120 mm temporal-mean precipitation (the average for the sampling dates of 2018) line (Fig.S2 f). In southeastern China, the water vapor d-excess is lower during the monsoon period than during the pre-monsoon period. The pattern of seasonal water vapor d-excess in northwestern China is the opposite. The two boundary lines separating the seasonal variations of $\delta^{18}\text{O}$ and d-excess do not overlap, suggesting different controls on water vapor $\delta^{18}\text{O}$ and d-excess.

3.3 Geographical origin of the air masses

The vapor isotope composition is a combined result of moisture source (Tian et al., 2007; Araguás-Araguás et al., 1998), condensation and mixing processes along the moisture transport route (Galewsky et al., 2016). To interpret the observed spatial-temporal distribution of vapor isotopes, we start with a diagnosis of the geographical origin of the air masses and then analyze the processes along the back-trajectories. Based on the tracing results from HYSPLIT4 model, we speculate on the potential water vapor sources (Fig.5 and Fig.10):

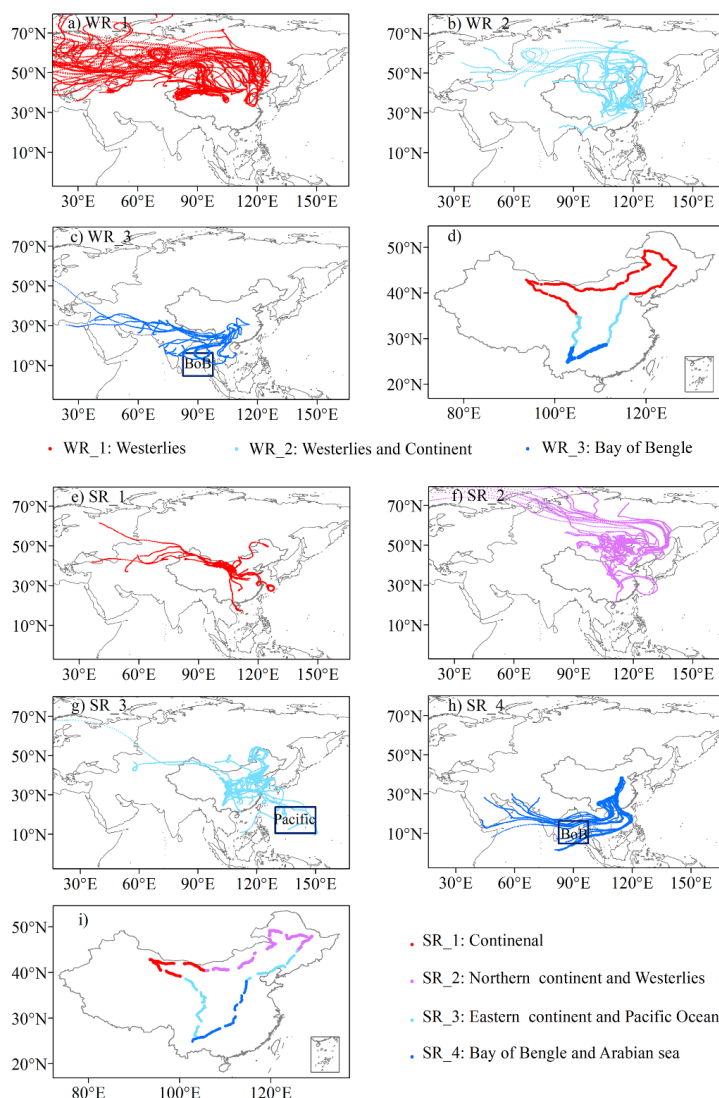


Fig.5 The backward trajectory results (a, b and c for the pre-monsoon period, and e, f, g and h for the monsoon period) and the dividing of the study zones based on geographical origin of the air masses (d for the pre-monsoon period and i for the monsoon period). Note: BoB is the abbreviation for the Bay of Bengal.

During the pre-monsoon period, we categorize our domain into 3 regions (Table 1).

- (1) In northern China (WR_1), the air is mainly advected by the Westerlies.
- (2) In central China (WR_2), the air also comes from the Westerlies but with a slower wind speed (as shown by the shorter trajectories in 10 days), suggesting potential for greater interaction with the land surface and more continental recycling as moisture source.
- (3) In southern China (WR_3), trajectories come from the Southwest and South with



marine moisture sources from the Bay of Bengal (BoB).
 During the monsoon period, we categorize our domain into 4 regions (Table 1):
 (1) In northwestern China (SR_1), most air masses also spend considerable time over the continent, suggesting some of the vapor can be recycled by continental recycling.
 (2) In northeastern China (SR_2), trajectories mainly come from the North and though the Westerlies.
 (3) In central China (SR_3), both in its eastern (from Beijing to Harbin) and western part, trajectories mainly come from the East. This suggests that vapor mainly comes from the Pacific Ocean, or from continental recycling over eastern and central China.
 (4) In southeastern China (SR_4), trajectories come from the South, suggesting marine moisture sources from the Arabian Sea and the BoB.

Table 1. The dividing of the study zones based on moisture sources and corresponding vapor $\delta^{18}\text{O}$ - $\delta^2\text{H}$ relationship

Pre-monsoon period				
	Water sources (Fig.5)	Region (China)	Climate background	$\delta^{18}\text{O}$ - $\delta^2\text{H}$ relationship
WR_1	Westerlies	The north	Westerlies domain	$\delta^{18}\text{O}=8.04\delta^2\text{H}+12.00$ ($r^2=0.99$, $n=750$, $q<0.01$)
WR_2	Westerlies and Continent	The middle	Transition domain	$\delta^{18}\text{O}=8.26\delta^2\text{H}+23.15$ ($r^2=0.99$, $n=281$, $q<0.01$)
WR_3	Bay of Bengal (BoB)	The south	Monsoon domain	$\delta^{18}\text{O}=7.98\delta^2\text{H}+17.13$ ($r^2=0.94$, $n=158$, $q<0.01$)
Monsoon period				
	Water sources (Fig.5)	Region (China)	Climate background	$\delta^{18}\text{O}$ - $\delta^2\text{H}$ relationship
SR_1	Continent	The northwest	Transition domain	$\delta^{18}\text{O}=8.31\delta^2\text{H}+20.92$ ($r^2=0.99$, $n=200$, $q<0.01$)
SR_2	Northern continent & Westerlies	The northeast	Transition domain	$\delta^{18}\text{O}=7.53\delta^2\text{H}+5.13$ ($r^2=0.98$, $n=294$, $q<0.01$)
SR_3	Eastern continent & Pacific Ocean	The middle and west	Transition domain	$\delta^{18}\text{O}=7.49\delta^2\text{H}+7.09$ ($r^2=0.97$, $n=271$, $q<0.01$)
SR_4	BoB & Arabian sea	The southeast	Monsoon domain	$\delta^{18}\text{O}=8.21\delta^2\text{H}+17.81$ ($r^2=0.99$, $n=195$, $q<0.01$)

4. Discussion

To interpret the spatial and seasonal variations observed both across China and in each region defined in section 3.3, we investigate q - δ diagrams (section 4.1), $\delta^{18}\text{O}$ - $\delta^2\text{H}$ relationships (section 4.2), relationships with meteorological conditions at the local and regional scale (sections 4.3 and 4.4) and the impact of air mass origin (section 4.5). We compare our observations with a simulation by a general circulation model Iso-GSM (section 4.6) and use such simulations to estimate the relative contributions of synoptic-scale perturbations and seasonal-mean spatial distribution (section 4.7).



359 4.1 q- δ diagrams

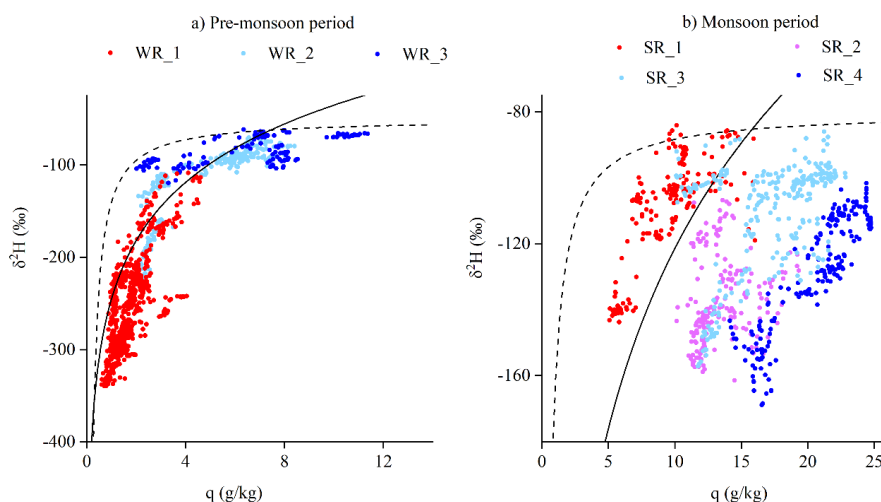


Fig.6 Scatterplot of observed vapor $\delta^2\text{H}$ (‰) versus specific humidity q (g/kg) during the pre-monsoon period (a) and monsoon (b) period. The solid black curves show the Rayleigh distillation line calculate for the initial conditions of $\delta^2\text{H}_0 = -50\text{‰}$, $T=15^\circ\text{C}$ during the pre-monsoon period and $\delta^2\text{H}_0 = -80\text{‰}$, $T=25^\circ\text{C}$ during the monsoon period. The mixing lines (dashed black curves) are calculated using a dry end-member with $q = 0.2$ g/kg and $\delta^2\text{H} = -500$ ‰ and air parcels for the corresponding Rayleigh curve as a wet end-member.

The progressive condensation of water vapor from an air parcel from the source region to the sampling site and the subsequent removal of condensate results in a gradual reduction of vapor isotope ratios. This relationship can be visualized in a q- δ diagram, which has been used in many studies of the vapor isotopic composition (Noone and David, 2012; Galewsky et al., 2016). Observations along the Rayleigh distillation line indicate progressive dehydration by condensation. Observations above the Rayleigh line indicate either mixing between air masses of contrasting humidity (Galewsky and Hurley, 2010) or evapotranspiration (Galewsky et al., 2011; Samuels-Crow et al., 2015; Noone and David, 2012; Worden et al., 2007). Observations below the Rayleigh line indicate the influence of rain evaporation (Noone and David, 2012; Worden et al., 2007). Figure 6 shows the observed vapor q- $\delta^2\text{H}$ for different regions during the pre-monsoon (a) and monsoon (b) period. This figure will be interpreted in the light of meteorological variables along back-trajectories (Fig.10).

During the pre-monsoon period, most q- $\delta^2\text{H}$ measurements are located surrounding or overlapping the Rayleigh curve (the solid black curve in Fig.6a). Therefore, the observed spatial pattern can mostly be explained by the gradual depletion of vapor isotopes by condensation. The data for the three moisture sources are distributed in different positions of the Rayleigh curve, relate to different moisture origins or different original vapor isotope values. This is confirmed by the back-trajectory analysis: the Westerlies bring cold and dry air to northern China (WR_1, Fig.5a, Fig.10a and c), consistent with the vapor further along the Rayleigh distillation, and thus very depleted (Fig.3a). The relatively high T and q along the ocean-sourced



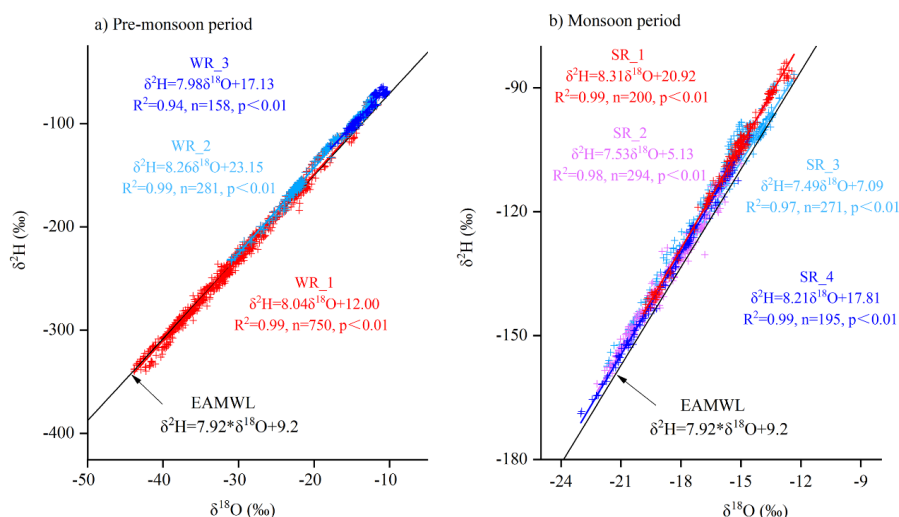
air trajectory reaching southern China (WR_3, Fig.5c, Fig.10a and c) is consistent with an early Rayleigh distillation phase during moisture transport, and thus higher water vapor $\delta^{18}\text{O}$ in southern China (Fig.3a). Some observations in the WR_3 region (Fig.5c) are located below the q - $\delta^2\text{H}$ Rayleigh distillation curve, indicating the influence of rain evaporation (Noone and David, 2012; Worden et al., 2007). This is consistent with the fact that air originates from the BoB, where deep convection begins to be active, and thus rain evaporation become a source of water vapor.

During the monsoon period, we find a scattered relationship in the q - $\delta^2\text{H}$ diagram for different regions, implying different moisture sources and/or water recycling patterns during moisture transport. Data measured in the SR_1 region (Fig.5i) fall above the Rayleigh distillation line (solid black curve in Fig.6b), likely due to the presence of moisture originating from continental recycling. A larger number of q - $\delta^2\text{H}$ measurements (most of the measurements from the SR_2, SR_3, and SR_4 regions, Fig.5i) are located below the Rayleigh curve, indicating moisture originating from the evaporation of rain drops within and below convective systems (Noone and David, 2012; Worden et al., 2007). In SR_3 and SR_4 regions, this is consistent with the high precipitation rate along Southerly and Easterly back-trajectories (Fig.10f). The convection is active over the Bay of Bengal, Pacific Ocean and South-Eastern Asia, as shown by the low OLR ($<240\text{W/m}^2$) in these regions (Fig.S3) (Wang and Xu, 1997). Therefore, a significant fraction of the water vapor originates from the evaporation of rain drops in convective systems. These results support recent studies showing that convective activity depleted the vapor during transport by the Indian and East Asian monsoon flow (Cai et al., 2018; He et al., 2015; Gao et al., 2013). In SR_2 region, the relatively low water vapor $\delta^{18}\text{O}$, below the Rayleigh curve, is also probably associated with the evaporation of rain drop under deep convective systems. This is confirmed by the high precipitation rates along Northerly back-trajectories (Fig.10f), reflecting summer continental convection.

In northern China, q - δ diagrams show stronger distillation during the pre-monsoon period. This suggests a “temperature dominated” control. Very low regional T during the pre-monsoon period (Fig.S2 a and Fig.10a) are associated with low saturation vapor pressures and enhanced distillation, producing lower vapor $\delta^{18}\text{O}$. The T in summer is higher (Fig.S2 b and Fig.10b), allowing for higher vapor $\delta^{18}\text{O}$. The $\delta^{18}\text{O}_{\text{monsoon}} - \delta^{18}\text{O}_{\text{pre-monsoon}}$ values in this region are therefore positive (Fig.4a). In the South, q - δ diagrams suggest the stronger influence of rain evaporation during the monsoon period. Higher precipitation amount significantly reduce $\delta^{18}\text{O}$ in the South (Fig.10f), even though T was higher during the monsoon period than in pre-monsoon. This suggests a “precipitation dominated” control in this region, explaining the negative values of $\delta^{18}\text{O}_{\text{monsoon}} - \delta^{18}\text{O}_{\text{pre-monsoon}}$. This seasonal pattern in $\delta^{18}\text{O}$ is consistent with the results in precipitation isotopes (Araguás-Araguás et al., 1998; Wang and Wang, 2001). The boundary line separating the seasonal variations of $\delta^{18}\text{O}$ is also consistent with previous study on seasonal difference in vapor $\delta^2\text{H}$ retrieved by TES and GOSAT (Shi et al., 2020).



426 4.2 The $\delta^{18}\text{O}$ - $\delta^2\text{H}$ relationship



427
 428 Fig.7 Regional patterns of vapor $\delta^{18}\text{O}$ - $\delta^2\text{H}$ relation during pre-monsoon period (a) and
 429 monsoon (b) period, compared with the East Asia Meteoric Water Line (EAMWL) (Araguás-
 430 Araguás et al., 1998).

431
 432 The $\delta^{18}\text{O}$ - $\delta^2\text{H}$ relationship is usually applied to diagnose the moisture source and water
 433 cycling processes related to evaporation. Figure 7 and Table 1 show the $\delta^{18}\text{O}$ - $\delta^2\text{H}$ relationship
 434 for different regions in the two seasons. We also plot the East Asian Meteoric Water Line
 435 (EAMWL) for a reference. Vapor $\delta^{18}\text{O}$ - $\delta^2\text{H}$ is usually located above Meteoric Water Line owing
 436 to the liquid water and vapor fractionation.

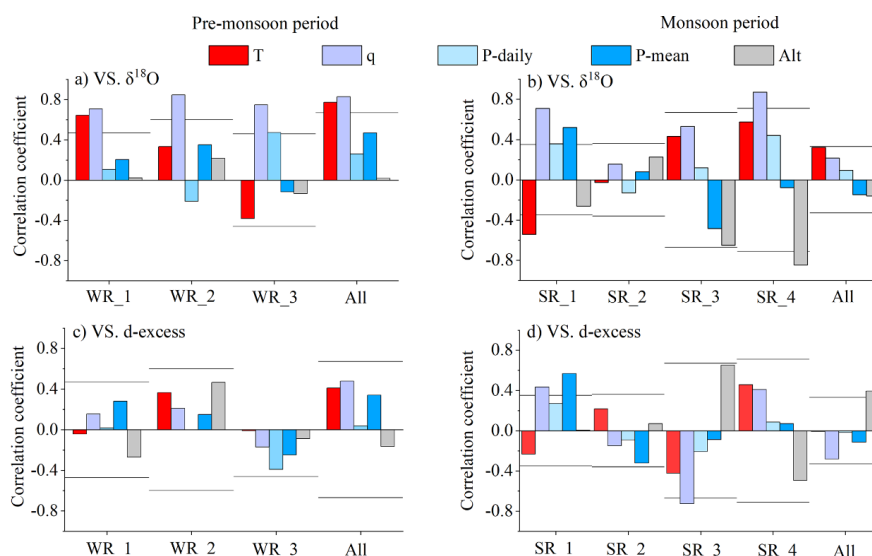
437 During the pre-monsoon period (Fig.7a), the data in northern China (WR_1, Fig.5a) are
 438 located at the lower-left area in the $\delta^{18}\text{O}$ - $\delta^2\text{H}$ graph, with similar slope and intercept as EAMWL
 439 ($\delta^2\text{H} = 8.04 \delta^{18}\text{O} + 12.00$). This corresponds to air bring by the Westerlies and following
 440 Rayleigh distillation. The linear relationship for the vapor in middle China (WR_2, Fig.5b) has
 441 the steepest slope and highest intercept ($\delta^2\text{H} = 8.26\delta^{18}\text{O} + 23.15$). These properties are
 442 associated with a strong d-excess, consistent with strong continental recycling. As continental
 443 recycling is known to have an enriching effect on the water vapor (Salati et al., 1979) and be
 444 associated with high d-excess (Gat and Matsui, 1991; Winnick et al., 2014). The high intercept
 445 is further consistent with a correlation between $\delta^{18}\text{O}$ and d-excess, which can typically result
 446 from continental recycling (Putman et al., 2019). The data for vapor originating from the BoB
 447 (WR_3, Fig.5c) are located to the upper right of the EAMWL. Their regression correlation
 448 shows similar features ($\delta^2\text{H} = 7.98 \delta^{18}\text{O} + 17.13$) to that of the monsoon season (with a slope
 449 of 8.21 and an intercept of 17.81). We find similar atmospheric conditions in the BoB (with the
 450 region marked as rectangle in Fig.5c and h) during the two observation periods, with $T=26^\circ\text{C}$
 451 and $\text{RH}=76\%$ during pre-monsoon period and $T=28^\circ\text{C}$ and $\text{RH}=78\%$ during the monsoon
 452 period, suggesting that the BoB source may have similar signals on vapor $\delta^{18}\text{O}$ and $\delta^2\text{H}$ in both
 453 seasons. These observed vapor $\delta^{18}\text{O}$ - $\delta^2\text{H}$ patterns are consistent with the back-trajectory results



454 indicating that the Westerlies persist in northern China during the pre-monsoon period, while
 455 moisture from the BoB has already reached southern China.

456 During the monsoon period (Fig.7b), the data in northwestern China (SR_1, Fig.5e) with
 457 continental moisture sources is located in the upper right of the graph but above the EAMWL,
 458 with a steepest slope and highest intercept for the linear $\delta^{18}\text{O}$ - $\delta^2\text{H}$ relationship ($\delta^2\text{H} = 8.31\delta^{18}\text{O}$
 459 $+20.92$). In contrast, the observations in southeastern China with BoB sources (SR_4, Fig.5h)
 460 are located in the lower left of the graph, with relatively lower intercept ($\delta^2\text{H} = 8.21\delta^{18}\text{O}$
 461 $+17.81$). This is the opposite pattern compared to the pre-monsoon season. The observations
 462 from the SR_3 region (Fig.5g) also have a low slope and low intercept ($\delta^2\text{H} = 7.49\delta^{18}\text{O} + 7.09$).
 463 This is consistent with the oceanic moisture from the Pacific Ocean. Also, these $\delta^{18}\text{O}$ - $\delta^2\text{H}$ data
 464 are located in the upper right of the graph with more scattered relation (with the lowest
 465 correlation coefficient), suggesting more diverse moisture sources. This is consistent with the
 466 mixing of water vapor from continental recycling and Pacific Ocean (Fig.5g). The observations
 467 in northeastern China (SR_2, Fig.5f) are located at the lower left of the graph, suggesting the
 468 influence of condensation along trajectories in northern Asia (Fig.10f). Compared to the SR_3
 469 and SR_4 regions, the slope and intercept of the observations in SR_2 region are lower ($\delta^2\text{H} =$
 470 $7.53\delta^{18}\text{O} + 5.13$), reflecting different origins of moisture.

471 4.3 Relationship with local meteorological variables



472
 473 Fig.8 Regional patterns of the correlation between $\delta^{18}\text{O}$ (a, b), d-excess (c, d) and various local
 474 factors (temperature (T), specific humidity (q), daily precipitation amount (P-daily) and
 475 temporal-mean precipitation amount for the sampling dates (P-mean), and altitude (Alt)). The
 476 left panel is for the pre-monsoon period and the right is for the monsoon period. Horizontal
 477 lines indicate the correlation threshold for statistical significance ($p < 0.05$), considered the
 478 degree of freedom.

479
 480 Here we analyze the relationship between vapor $\delta^{18}\text{O}$, d-excess and local meteorological



parameters, for all observations, and separately for the different regions (Fig.8 and Table S1).

We have taken particular care to estimate the statistical significance of the correlation coefficients. The statistical significance of a correlation depends on the correlation coefficient and on the degree of freedom D of the observed $\delta^{18}\text{O}$ and d-excess time series. Since these variables evolve smoothly in time and are sampled at a high frequency, the total number of samples overestimates the degree of freedom D of the time series. We thus estimated the degree of freedom D as T/η , where T is the length of the sampling period and η is the characteristic auto-correlation time scale of the time series (an example of this calculation is given in III. Supplementary text). A similar method was used to calculate the degree of freedom of the signal in Roca et al.(2010). Table S2 summarizes the threshold for the correlation coefficient to be statistically significant at 95%, for the two seasons, the different regions and the variable of interest.

During the pre-monsoon period, all observations exhibit a “temperature effect” (Fig.8a), with significant and positive correlation between $\delta^{18}\text{O}$ and T ($r = 0.77$, $p < 0.05$, Table S1). This results from the high correlation between $\delta^{18}\text{O}$ and q ($r = 0.83$, $p < 0.05$, Table S1), consistent with the Rayleigh distillation, and between T and q ($r = 0.54$, $p < 0.05$), consistent with the Clausius Clapeyron relationship. The vapor $\delta^{18}\text{O}$ in the WR_1 (Fig.5a) region show similar correlations with T and q as for all observations. Rayleigh distillation thus contributes to the relationship between $\delta^{18}\text{O}$ and T observed in northern China. In contrast, no significant positive correlation between vapor $\delta^{18}\text{O}$ and T is observed in the WR_3 region with the BoB water source. This is consistent with the fact that the moisture from the BoB has already influence southern China during the pre-monsoon period (Fig.5c). The weak positive correlation in most regions between $\delta^{18}\text{O}$ and P-daily and P-mean might simply reflect the control of q on observed vapor $\delta^{18}\text{O}$, due to the relatively high correlation between observed P-mean and q , with $r = 0.58$ for all observations (Fig.2).

During the monsoon period (Fig 8b), no significant correlation emerges when considering all observations. Vapor $\delta^{18}\text{O}$ is still significantly correlated with q in the SR_1 (Fig.5e, $r = 0.71$, $p < 0.05$, Table S1) and SR_4 (Fig.5h, $r = 0.87$, $p < 0.05$, Table S1) regions. This is consistent with different degrees along the Rayleigh distillation. The absence of correlation with T suggests that the variations in q mainly reflect variations in relative humidity that are associated with different air mass origins. The $\delta^{18}\text{O}$ is significantly anti-correlated with Alt in the SR_4 region ($r = -0.85$, $p < 0.05$, Table S1), consistent with the “altitude effect” in precipitation and water vapor (Dansgaard, 1964;Galewsky et al., 2016).

The vapor d-excess for all observations during the monsoon period (Fig.8d) is positively correlated with Alt ($r = 0.39$, $p < 0.05$, Table S1). One possible reason is that the vapor d-excess is lower in coastal areas at lower altitudes, while at higher altitudes in the west, more recycling moisture leads to higher d-excess. Alternatively, this may reflect the fact that the d-excess generally increases with altitude (Galewsky et al., 2016). In the SR_1 region (Fig.5e), in arid northwestern China, vapor d-excess is positively correlated with q ($r = 0.43$, $p < 0.05$, Table S1) and P-mean ($r = 0.57$, $p < 0.05$, Table S1) during the monsoon period, suggesting that rain evaporation may also contribute to high d-excess (Kong and Pang, 2016). Other than these examples, the correlation coefficients between the d-excess and T , q , P , and Alt are not significant (Fig.8c and d), indicating that the local meteorological variables are not strongly related to vapor d-excess, as was reported in previous studies for precipitation isotopes (Guo et



al., 2017; Tian et al., 2003).

4.4 Relationship with meteorological variables along trajectories

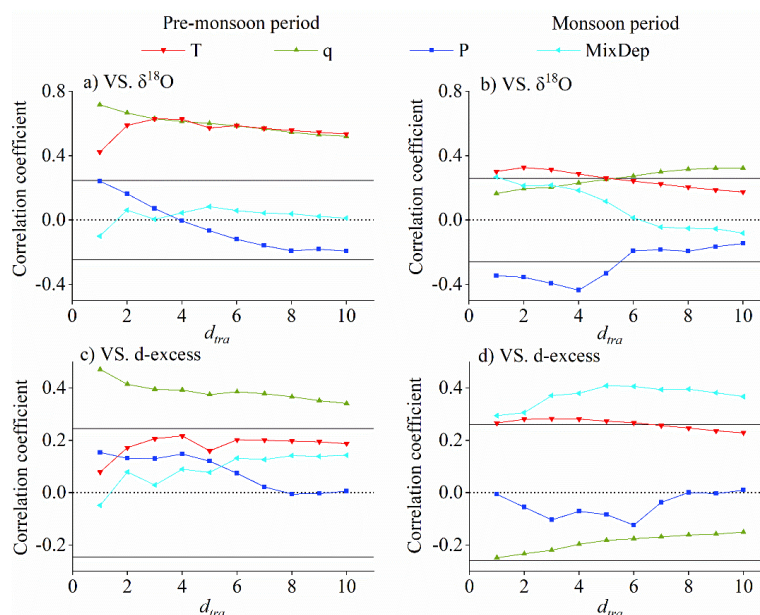


Fig.9 Correlation between $\delta^{18}\text{O}$ (a, b), d-excess (c, d), and various meteorological factors (air temperature (T), specific humidity (q), precipitation (P), and mixing depth (MixDep)) along the air mass trajectories during the pre-monsoon period (the left panel) and monsoon period (the right panel). The coordinate d_{tra} represents the period prior to the observations (1~10 days), e.g., $d_{tra}=2, 3, 4, \dots$ represents the correlation coefficient with the temporal mean of meteorological data on the air mass trajectories during vapor transmission from the 1st to the 2nd, 3rd, 4th, day prior to the observations. Horizontal solid lines indicate the correlation threshold for statistical significance ($p < 0.05$).

Vapor isotopes values also reflect processes that occur along air mass trajectories. We therefore perform a correlation analysis between vapor isotope observations and the temporal mean meteorological conditions along air mass trajectories. The meteorological conditions are averaged over the d_{tra} previous days (1~10 days) prior to the observations.

The $\delta^{18}\text{O}$ values have the strongest correlations with T and q along air mass trajectories during the pre-monsoon period (Fig.9a). The results show gradually increasing positive correlation coefficients as d_{tra} changes from 10 to 3, reflecting the large spatial and temporal coherence of T variations during the pre-monsoon period. During the monsoon period, the negative correlation coefficients between $\delta^{18}\text{O}$ and P (Fig.9b) become more significant as d_{tra} increases from 1 to 4 and less significant as d_{tra} increases from 5 to 10. This result indicates a maximum impact of P during a few days prior to the observations, as observed also for precipitation isotopes (Gao et al., 2013; Risi et al., 2008a). It is further consistent with the influence of precipitation along back-trajectories (Fig.10f). Mixing depth (MixDep) is stably



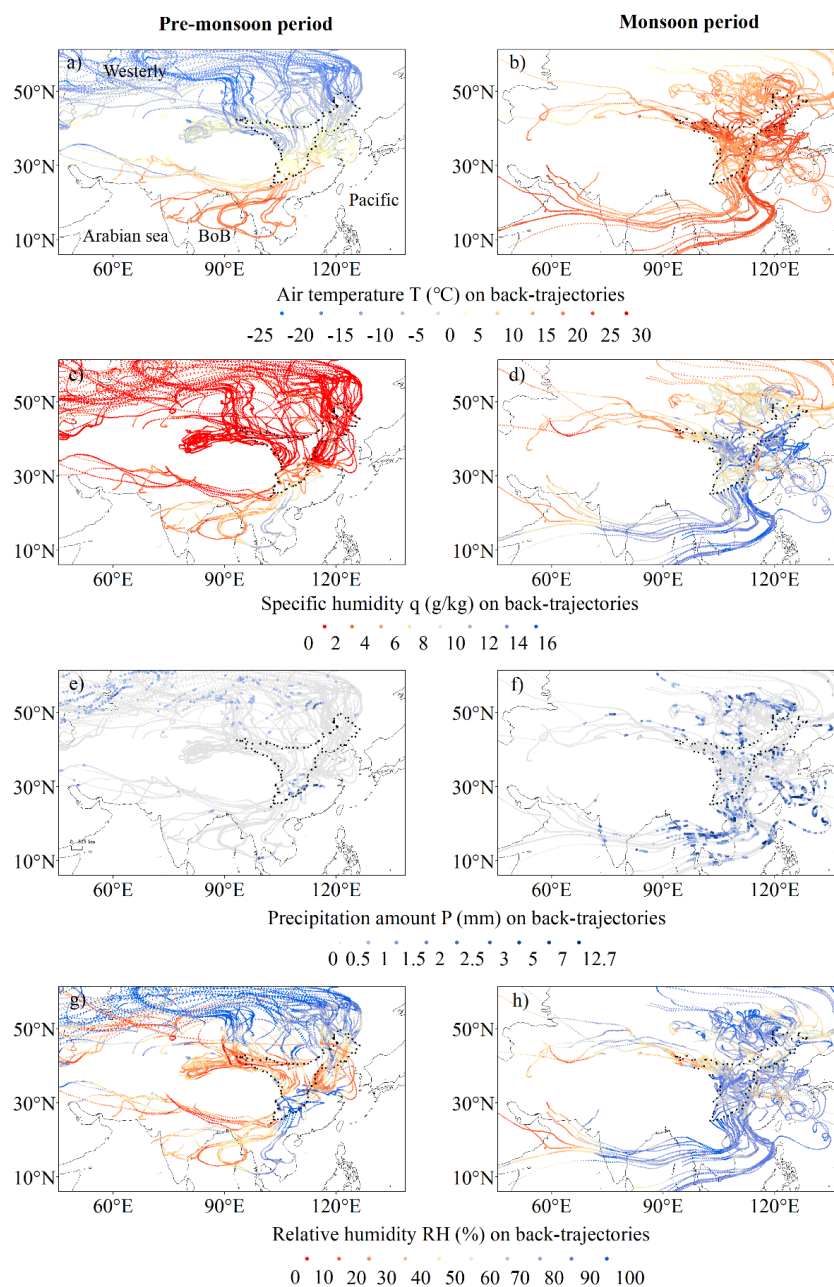
and positively correlated with d-excess. A hypothesis to explain this correlation is that when the MixDep is higher, stronger vertical mixing of convective system transports vapor with higher d-excess values from higher altitude to the surface (Galewsky et al., 2016; Salmon et al., 2019).

4.5 Relationship between water vapor isotopes and moisture sources

In section 4.1 to 4.4, we have discussed that different moisture sources and corresponding processes on transport pathways are related to the observed spatial patterns both in vapor $\delta^{18}\text{O}$ and d-excess.

We also identify different isotopic values of vapor from different ocean sources during the monsoon period. The vapor $\delta^{18}\text{O}$ in the zone from Beijing to Harbin and western China with Pacific Ocean and continental origins (SR_3 region, about -17‰ to -13‰) are higher than those in the Southeast with BoB sources (SR_4 region, about -23‰ to -15‰) (Fig.5i and Fig.3b). In sections 4.1 and 4.2, we have shown that it is related to the extent of the Rayleigh distillation and rain evaporation associated with convection along trajectories. Earlier studies suggest that lower $\delta^{18}\text{O}$ values were observed from the Indian monsoon source than from Pacific Asian monsoon moisture due to the different original isotope values in the source regions (Araguás-Araguás et al., 1998). To better isolate the direct effect of moisture sources, we extract the initial vapor isotopes of the Indian and East Asian monsoon systems (the regions are marked as annotated rectangles in Fig.5g and h) for the sampling dates of 2018 from the Iso-GSM model. The values are about $\delta^{18}\text{O} = -12\text{‰}$ and $\delta^2\text{H} = -83\text{‰}$ in the northern BoB and $\delta^{18}\text{O} = -14\text{‰}$ and $\delta^2\text{H} = -97\text{‰}$ in the eastern Pacific Ocean. The initial vapor isotope values of the two vapor sources are not significantly different. The initial vapor isotopes in the BoB are even slightly higher than those in the Pacific Ocean, contrary to moisture source hypothesis. The OLR was significantly lower in the BoB than in the Pacific Ocean (Fig.S3). This suggests that the more active convection in the Indian Ocean leads to lower water vapor isotope ratios (Liebmann and Smith, 1996; Bony et al., 2008; Risi et al., 2008b; Risi et al., 2008a) in southeastern China, rather than the initial composition of the moisture source.

Continental recycling probably also contribute to higher $\delta^{18}\text{O}$ in the SR_3 region (Fig.5i and Fig.3b) (Salati et al., 1979), especially in western China (Fig.5i), which can be confirmed by the higher d-excess in this region (Fig.3d) (Gat and Matsui, 1991; Winnick et al., 2014). In the zone from Beijing to Harbin (Fig.5i), greater proportion of water vapor from Pacific sources than continental recycling and is in the early stage of Rayleigh distillation, could result in high vapor $\delta^{18}\text{O}$ (Fig.3b) but relatively low d-excess (Fig.3d).



583
 584 Fig.10 Meteorological conditions simulated by HYSPLIT4 model along the 10-day air back-
 585 trajectories for the on-route sampling positions during the two surveys: (a, b) air temperature T
 586 (°C), (c, d) specific humidity q (g/kg), (e, f) precipitation amount P (mm) and (g, h) relative
 587 humidity RH (%). The left panel is for the pre-monsoon period and the right is for the monsoon
 588 period. The driving locations and time every 2 hours are used as starting points. Note: BoB is
 589 the abbreviation for the Bay of Bengal.



In previous studies, the d-excess has been interpreted as reflecting the moisture source and evaporation conditions (Jouzel et al., 1997). During the pre-monsoon period, lower T and higher RH over evaporative regions for the vapor transported by the Westerlies (Fig.10 a and g, Fig.S2 a and g) reduces the kinetic fractionation and produces lower vapor d-excess in the WR_1 region (Fig.5a, Fig.3c) (Jouzel et al., 1997; Merlivat and Jouzel, 1979). In contrast, higher T and lower RH over evaporative regions (Fig.10 a and g, Fig.S2 a and g) for the vapor coming from the South leads to higher d-excess in southern China (WR_3, Fig.5c, Fig.3c). This is consistent with the global-scale poleward decrease in T and increase in surface RH over the oceans resulting in global-scale poleward decrease in d-excess at mid-latitudes (Risi et al., 2013a; Bowen and Revenaugh, 2003). We find that continental recycling further increases d-excess in middle China (WR_2, Fig.5b, Fig.3c) (Gat and Matsui, 1991; Winnick et al., 2014). During the monsoon period, the lower vapor d-excess observed in eastern China (Fig.3d) is likely a sign of the oceanic moisture, derived from source regions where RH at the surface is high (Fig.10h and Fig.S2 h) and thus reduce kinetic fractionation and lower d-excess. The high d-excess values observed in western and northwestern China (Fig.3d) reflect the influence of continental recycling (Fig.5e and g).

The seasonal variation of moisture sources also results in a seasonal difference in d-excess (Fig.4b). In southeastern China, RH over the ocean surface in summer is higher than in winter (Fig.S2 g and h, and Fig.10g and h), resulting in negative values of $d\text{-excess}_{\text{monsoon}} - d\text{-excess}_{\text{pre-monsoon}}$ (Fig.4b). Northwestern China has an opposite pattern of seasonal vapor d-excess. This result largely due to the extremely low vapor d-excess during the pre-monsoon period (Fig.3c). Also, we speculate that a greater contribution of continental recycling leads to higher d-excess during the monsoon period than during the pre-monsoon period (Risi et al., 2013b) and the positive values of the $d\text{-excess}_{\text{monsoon}} - d\text{-excess}_{\text{pre-monsoon}}$ (Fig.4b).

4.6 Evaluation of Iso-GSM simulations

Our observed variations along the routes across China for a given period represent a mixture of synoptic-scale perturbations and seasonal-mean spatial distribution. To quantify these relative contributions, we use daily and temporal-mean simulations of Iso-GSM.

Before using the simulations, we first evaluate the ability of Iso-GSM to capture the observed spatial-temporal vapor isotopic variations in China here.

Figure 11 shows the comparison of the measured vapor $\delta^{18}\text{O}$ and the outputs of Iso-GSM. Iso-GSM captures the variations in observed vapor $\delta^{18}\text{O}$ well during the pre-monsoon period, with correlation coefficient of $r = 0.84$ ($p < 0.01$) (Table S3). The simulation results during the monsoon period are roughly in the range of observations, but detailed fluctuations are not well captured, with $r = 0.24$ ($p > 0.05$) (Table S3). The largest differences occur in the SR_1 zone.

To diagnose the reasons for the GCMs performance, we compare the observed and simulated vapor $\delta^{18}\text{O}$, q, P-mean and T (spatial variations of the differences are shown in Figure 12, time series of the differences are shown in Figure S4, and correlation coefficients are shown in Table S3). During the pre-monsoon period, Iso-GSM overestimates observed $\delta^{18}\text{O}$ along most of the survey route (Fig.12a), with the largest difference in northwestern China, and underestimates the vapor $\delta^{18}\text{O}$ in the southern part of the study region. Our results are consistent with previous studies showing that many models underestimate the heavy isotope depletion in pre-monsoon seasons in subtropical and mid-latitudes, especially in very dry regions (Risi et



al., 2012). The differences in $\delta^{18}\text{O}$ (Fig.12a) and q (Fig.12c) are spatially consistent. The overestimation (respectively underestimation) of $\delta^{18}\text{O}$ therefore could be due to the overestimation (respectively underestimation) of q . The contrasting errors in southern and northern China also probably suggest that Iso-GSM does not capture the influence of BoB moisture on southern region during the pre-monsoon period well. Despite this, the good agreement during pre-monsoon period is probably due to the dominant control by Rayleigh distillation on spatial variations of isotopes in this season. The q variation, in relation with T , drives vapor isotope variations and is well captured by Iso-GSM spatially, with significant correlations between observed and simulated q ($r = 0.84$, slope=0.70 in Table S3) and T ($r = 0.87$, slope=0.70 in Table S3), though q is overestimated in the North and underestimated in the South.

During the monsoon period, Iso-GSM underestimates the vapor $\delta^{18}\text{O}$ along most of the survey route (Fig.12b). It is possible that Iso-GSM generally overestimates the influence of the monsoon that depletes vapor, or underestimates the enriching effect of continental recycling. In particular, Iso-GSM underestimates q and T along most of the survey route (Fig.12 d and h, and Fig.S4), and overestimates P -mean in the South (Fig.12f). Besides, the altitude effect is wrongly simulated for several regions with higher correlations (Fig.S5), which could also result in underestimates of $\delta^{18}\text{O}$.

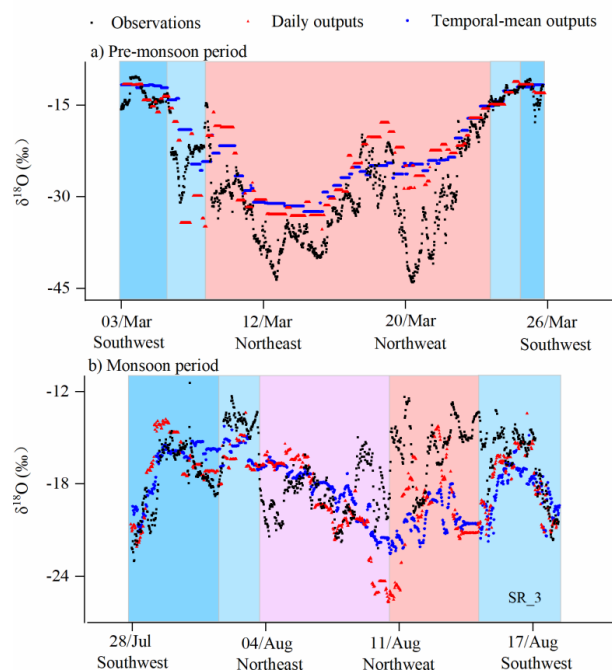
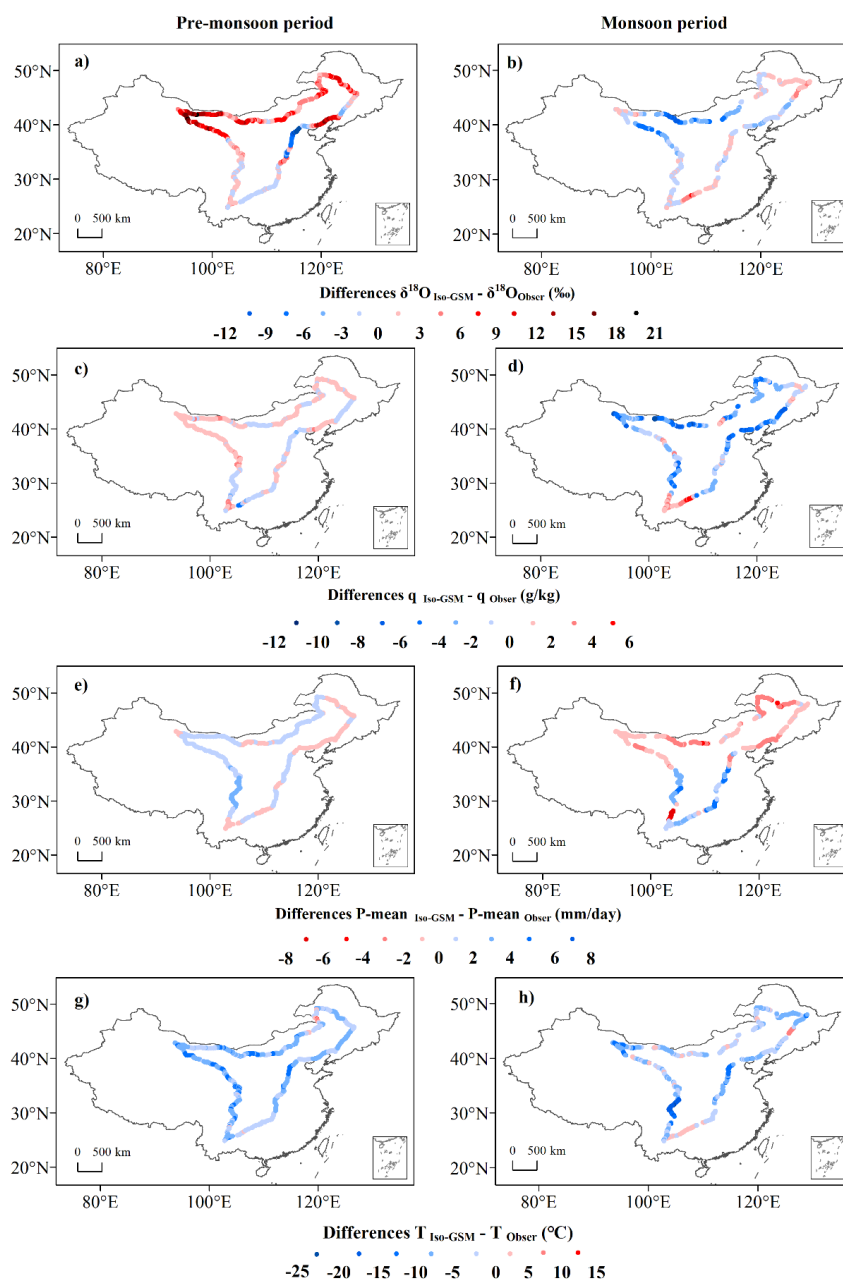


Fig.11 Comparison of observed vapor $\delta^{18}\text{O}$ (observations) with outputs of Iso-GSM during the pre-monsoon period (a) and monsoon period (b). The model results in this graph are from the daily and temporal-mean surface layer outputs for the sampling dates and locations. Note: the outputs during the monsoon period had been corrected for altitude.



656

657 Fig.12 Spatial distribution of the differences between the outputs of Iso-GSM (subscripts are
 658 IsoGSM) and observations (subscripts are Obser) during the pre-monsoon period (the left panel)
 659 and monsoon period (the right panel): $\delta^{18}\text{O}$ (a and b, ‰), specific humidity q (c and d, g/kg),
 660 temporal-mean precipitation amount P -mean for the sampling dates (e and f, mm/day), and
 661 temperature T (g and h, °C).



4.7 Disentangling synoptic and spatial variations using isotope-enabled general circulation models

The variations for temporal-mean outputs of $\delta^{18}\text{O}$ are smoother but similar to those for the daily outputs from Iso-GSM (Fig.11). The daily variations of $\delta^{18}\text{O}$ simulate by Iso-GSM can be written as:

$$\delta^{18}\text{O}_{\text{daily}} = \delta^{18}\text{O}_{\text{seaso}} + \delta^{18}\text{O}_{\text{synoptic}} \quad (4)$$

where $\delta^{18}\text{O}_{\text{seaso}}$ is the temporal-mean $\delta^{18}\text{O}$ for the sampling dates and $\delta^{18}\text{O}_{\text{synoptic}}$ = $\delta^{18}\text{O}_{\text{daily}} - \delta^{18}\text{O}_{\text{seaso}}$. The first term represents the contribution of seasonal-mean spatial variations, whereas the second term represents the contribution of synoptic scale variations. To evaluate contribution of these two terms, we calculate the slopes of $\delta^{18}\text{O}_{\text{daily}}$ as a function of $\delta^{18}\text{O}_{\text{seaso}}$ (a_{seaso}), and of $\delta^{18}\text{O}_{\text{daily}}$ as a function of $\delta^{18}\text{O}_{\text{synoptic}}$ (a_{synoptic}). The relative contributions of spatial and synoptic variations correspond to a_{seaso} and a_{synoptic} respectively. The same analysis is done for T, q and P as well (Table 2).

Table 2 The relative contribution (in units of 1) of spatial variations at the regional scale for a given season (a_{seaso}) vs synoptic-scale variations (a_{synoptic}). Notes: we used the simulated $\delta^{18}\text{O}$, temperature T, specific humidity q and precipitation P from Iso-GSM. The sum is the

a_{seaso} plus a_{synoptic} .				
		a_{seaso}	a_{synoptic}	Sum
Pre-monsoon	$\delta^{18}\text{O}$	0.81	0.19	1
	T	0.77	0.23	1
	q	0.93	0.07	1
	P	0.24	0.76	1
Monsoon	$\delta^{18}\text{O}$	0.60	0.40	1
	T	0.69	0.31	1
	q	0.86	0.14	1
	P	0.47	0.53	1

During the pre-monsoon period, the relative impact of seasonal mean spatial variations on the total simulated variations of $\delta^{18}\text{O}$ (81%) are much higher than that of synoptic-scale variations (19%), suggesting that the observed variability is mainly due to spatial variability, and marginally due to synoptic-scale variability. During the monsoon period, the relative impact of synoptic-scale variations (40%) on the total simulated variations of $\delta^{18}\text{O}$ become more significant, but the contribution of seasonal-mean spatial variations still dominate (60%). The same patterns are observed for T and q in both seasons. In contrast, the contribution of synoptic-scale variations to daily P variations is 76% during the pre-monsoon period and 53% during monsoon period. This is consistent with the local and intermittent nature of precipitation.

4.8 Urban emissions

We observed abnormally low d-excess in short episodes while vehicles were driving in or out cities or stuck in traffic jams (Fig.2 and Section 2.3). These data have a much lower than normal d-excess, and a much lower intercept in the linear $\delta^{18}\text{O} - \delta^2\text{H}$ relationship (Fig.S6). We



argue that these data are significantly influenced by fuel combustion. Previous studies on urban vapor isotopes (Gorski et al., 2015; Fiorella et al., 2018; Fiorella et al., 2019) showed that the vapor d-excess closely tracked changes in CO₂ through inversion events and during the daily cycle dominated by patterns of human activity, and combustion-derived water vapor is characterized by a low d-excess value due to its unique source. We also find that the d-excess values are especially low when the vehicle was in cities in the afternoon. The values increased to normal during the night. This diurnal cycle is likely related to the emission intensity and atmospheric processes (Fiorella et al., 2018). These results imply that the emission of water vapor through the combustion of fossil fuels is a significant component of the atmospheric water budget in the urban boundary layer and a very common phenomenon in most cities. This strong signal is detectable by vapor isotopes and has a significant influence on the vapor d-excess in urban areas and the relationship between $\delta^{18}\text{O}$ and $\delta^2\text{H}$, with potential implications for urban climate, ecohydrology, and photochemistry (Gorski et al., 2015).

5 Conclusion

Our new, vehicle-based observations document spatial and seasonal variability in surface water vapor isotopic composition across a large part of China. Both during the pre-monsoon and monsoon periods, it is clear that different moisture sources and corresponding processes on transport pathways explain the spatial patterns both in vapor $\delta^{18}\text{O}$ and d-excess (summarized in Fig.13):

(1) During the pre-monsoon period (Fig.13a), the latitudinal gradient of vapor $\delta^{18}\text{O}$ and d-excess were observed. The gradient in $\delta^{18}\text{O}$ reflects the “temperature effect”, Rayleigh distillation appears to be the dominant control, roughly consistent with earlier studies on precipitation. Vapor in northern China, derived from westerlies, and subject to stronger Rayleigh distillation (low q and T), is characterized by very low isotope ratios. Less complete Rayleigh distillation (relatively high q and T) results in less depleted vapor in southern China. The vapor d-excess in northern China is low, probably due to the high RH over high-latitude oceanic moisture sources for the vapor transported by the Westerlies (green arrow), reducing the kinetic fractionation during ocean evaporation. In contrast, the lower RH over low-latitude moisture sources for the vapor transported to southern China leads to higher d-excess (yellow arrow). Additional vapor sourced from continental recycling (red zigzag arrows), further increases the d-excess values in middle China. This distribution is consistent with the back-trajectory results showing that during the pre-monsoon period, the vapor in southwestern China comes from the BoB, whereas Westerly moisture sources still persist in northern China.

(2) During the monsoon period (Fig.13b), the lowest vapor $\delta^{18}\text{O}$ occurred in southwestern and northeastern China, and higher vapor $\delta^{18}\text{O}$ values were observed in between, while the d-excess features a west-east contrast. The relatively lower vapor $\delta^{18}\text{O}$ result from deep convection along the moisture transport pathway. Meanwhile, the mixing with moisture from continental recycling increases the vapor $\delta^{18}\text{O}$ values in middle and northwestern China. We observed lower vapor $\delta^{18}\text{O}$ values when the moisture originates from the BoB than from the Pacific Ocean, consistent with stronger convection during transport. The dominance of oceanic moisture results in the lower vapor d-excess in eastern China (green arrow), whereas continental recycling produces higher vapor d-excess in western and northwestern China.



(3) Variation in temperature drive the seasonal variations of vapor $\delta^{18}\text{O}$ in northern China, whereas convective activity along trajectories produces low vapor $\delta^{18}\text{O}$ during the monsoon season and drive the seasonal variation in south China. Seasonal d-excess variation reflects different conditions in the sources of vapor: in southeastern China it is mainly due to differences in the RH over the adjacent ocean surface, while in northwestern China it is mainly due to the vapor transported by the Westerlies during the pre-monsoon period and a great contribution of continental recycling during the monsoon period.

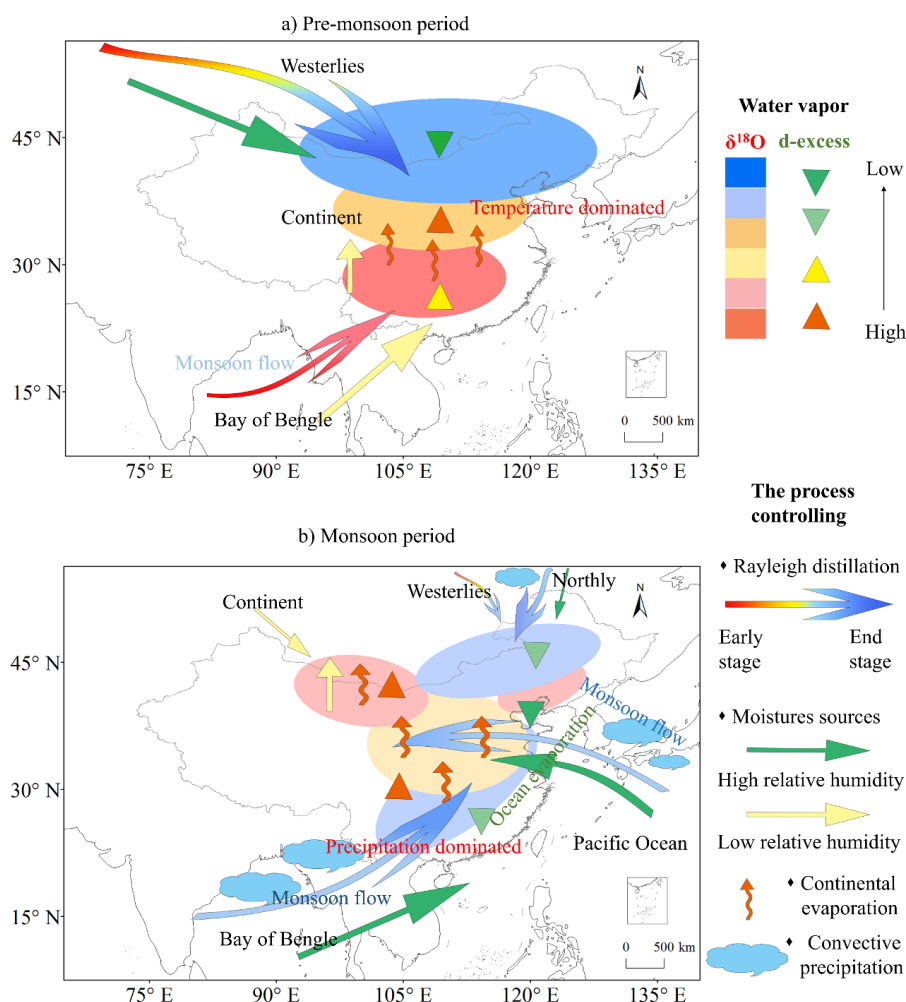


Fig.13 Schematic picture summarizing the different processes controlling the observed spatial patterns and seasonality of vapor isotopes.

The Iso-GSM model captures the vapor $\delta^{18}\text{O}$ spatial pattern accurately during the pre-monsoon period, likely due to the large latitudinal contrast in the humidity and temperature in this season. However, the overall performance is weaker during the monsoon period. Modeling



750 results indicate that the observed temporal variations along the route across China are mainly
751 due to temporal-mean spatial variations, and marginally due to synoptic-scale variations.
752 Therefore, our observed snapshots provide the representative pictures of temporal-mean spatial
753 patterns.

754 Our study on the processes governing water vapor isotopic composition at the regional
755 scale provides an overview of the spatial distribution and seasonal variability of water isotopes
756 and their controlling factors, providing an improved framework for interpreting the
757 paleoclimate proxy records of the hydrological cycle in low and mid-latitudes. In particular, our
758 results suggest a strong interaction between local factors and circulation, emphasizing the need
759 to interpret proxy records in the context of the regional system. This also suggests the potential
760 for changes in circulation to confound interpretations of proxy data.

761 **Data availability**

762 The data acquired during the field campaigns and concurrent simulations from the isotope-
763 incorporated global spectral model (Iso-GSM) used has been submitted to the PANGAEA
764 repository. The temporary link is <https://issues.pangaea.de/browse/PDI-31288> and the final
765 DOI will be given as part of the revision process. This dataset can be provided by the
766 corresponding author upon request. Other data used can be downloaded from the corresponding
767 website which were listed in the text.

768 **Author contributions**

769 L.T. and D.W. designed the research; D.W., and X.J. conducted to the field observations; J.C.
770 and J. B. contribute to the data calibration; Z.W. and K.Y performed Iso-GCM simulations;
771 D.W., C.R., and L.T. performed analysis; All authors contributed to the discussion of the results
772 and the final article; D.W. drafted the manuscript with contributions from all co-authors; C.R.,
773 L.T. and J. B. checked and modified the manuscript.

774 **Competing interests**

775 The authors declare that they have no conflict of interest.

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