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1                    **Correcting for water vapor diffusion in air bag samples for**  
2                    **isotope composition analysis: cases studies with drone-collected**  
3                    **samples**

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22 **Abstract**

23 Traditional methodologies, such as mass spectrometry and laser spectroscopy, have been  
24 widely employed for precise water vapor isotope measurements. Nevertheless, these techniques  
25 are limited by logistical challenges in fieldwork, consequently constraining the temporal and  
26 spatial resolution of measurements. Specifically, water vapor isotope measurements are  
27 primarily limited to near-surface levels, while measurements associated with processes aloft  
28 connecting tropospheric water vapor to surface precipitation are notably scarce. Portable  
29 sampling devices, such as air bags and glass bottles, have therefore become necessary  
30 alternatives for collecting, storing, and transporting gaseous samples in diverse environments  
31 prior to analysis with less portable instruments. In drone-based high-altitude vapor sampling,  
32 air bags are preferred for their lighter weight and greater flexibility compared to glass bottles.  
33 Nevertheless, they present specific challenges, such as potential sample contamination and  
34 isotopic fractionation during storage, primarily due to the inherent permeability of air bags.  
35 Here, we developed a theoretical model for water vapor diffusion through the sampling bag  
36 surface, with parameters calibrated through laboratory experiments. This model enables the  
37 reconstruction of the initial isotopic composition of sampled vapor based on measurements  
38 obtained within the bag and from the surrounding environment. This diffusion model underwent  
39 rigorous validation through experiments conducted under diverse conditions, confirming its  
40 reliability. We applied this correction method to air samples collected at various pressures up  
41 to the upper troposphere using an air bag-mounted drone that we developed, thereby estimating  
42 the initial isotopic composition and uncertainty based on our observations. The corrected  
43 observations closely match the Picarro direct observations and IASI satellite data. Our  
44 correction method significantly enhances the reliability and applicability of water vapor isotope  
45 observations conducted using drones equipped with air bags. This approach leverages the  
46 strengths of drone-based air bag sampling while mitigating its limitations, thus facilitating the  
47 convenient collection of isotopic data throughout the troposphere.  
48



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## 49 1 Introduction

50 Water vapor isotopes provide unique insights into the transport, mixing, and phase changes  
51 of water in the environment, which are crucial for improving understanding of the climate  
52 system, hydrological cycle, atmospheric dynamics, and paleoclimate proxies. Water isotopes  
53 have also been applied in climate modeling, weather prediction, and water resource  
54 management (Bowen et al., 2019; Galewsky et al., 2016; Gat, 1996; West et al., 2009).

55 Water isotope analysis has traditionally relied on mass spectrometry, which, while accurate  
56 (Ghosh and Brand, 2003; Muccio and Jackson, 2009), demands labor-intensive preparation and  
57 lacks portability (West et al., 2010). Methods like cryogenic trapping effectively collect water  
58 vapor (Grootes and Stuiver, 1997; Michener and Lajtha, 2008; Steen-Larsen et al., 2011; Yu et  
59 al., 2015), but they require long sampling periods, limiting observation scope and timing. Over  
60 the past three decades, laser spectroscopy methods such as Cavity Ring-Down Spectroscopy  
61 (CRDS) (Hodges and Lisak, 2006) and Off-Axis Integrated Cavity Output Spectroscopy (OA-  
62 ICOS) (Johnson et al., 2011) have emerged, delivering a best-in-class combination of speed,  
63 high precision, and continuous measurements even in challenging environments such as high  
64 altitudes or arid regions with low water vapor content. Advances in these instruments have  
65 significantly expanded the field of water isotope research. However, their heavy  
66 instrumentation, substantial power requirements, and limited mobility restrict their usability in  
67 certain situations. As a result, the collection and storage of physical samples are still necessary,  
68 increasing the demand for more convenient and efficient sample acquisition methods. Air bags  
69 and glass bottles have been practical solutions for collecting, storing, and transporting gaseous  
70 samples from various settings (Jiménez-Rodríguez et al., 2019; Rozmiarek et al., 2021).

71 Given that air bags can reduce the weight of sampling equipment and increase sampling  
72 flexibility, there is considerable interest in using them for vapor sample collection. This is  
73 particularly advantageous for small equipment like drones, where minimizing payload weight  
74 is essential for sampling at high altitudes or over long distances. This selection also makes it  
75 easier to transport samples and reduces the risk of breakage. However, concerns have arisen  
76 regarding the suitability of various sampling materials for storing these samples, primarily due  
77 to potential water diffusion through container walls. Diffusion issues are commonly observed  
78 in sampling bags during water vapor isotope analysis and have persisted as a longstanding  
79 challenge in the field (Herbstritt et al., 2023; Jiménez-Rodríguez et al., 2019). In previous  
80 studies, this issue is particularly concerning in the Direct Vapor Equilibrium Laser  
81 Spectroscopy (DVE-LS) method, which has been widely used to rapidly collect and measure  
82 water isotopes in evaporation-prone soil, rock, or plant samples. The DVE-LS method  
83 simplifies preparation and increases sample throughput by directly analyzing the vapor phase,  
84 thus eliminating the need for extensive physical extractions (Gralher et al., 2021; Hendry et al.,  
85 2015; Millar et al., 2018; Sprenger et al., 2015; Wassenaar et al., 2008). However, water vapor  
86 molecules may exchange between the air inside the bag and the external ambient air during  
87 sample storage. Water vapor molecules typically diffuse from areas of high humidity to drier  
88 areas. In this process, heavier isotopes (e.g.,  $\text{H}_2^{18}\text{O}$  and  $\text{HDO}$ ) move more slowly than lighter  
89 isotopes (e.g.,  $\text{H}_2^{16}\text{O}$ ) due to their greater mass, resulting in preferential diffusion of lighter  
90 isotopes. This selective diffusion, known as fractionation, can alter the original isotopic



91 composition of the collected air samples.

92 To mitigate these issues, materials with lower permeability are suggested for water vapor  
93 isotope measurements (Herbstritt et al., 2023). Further research and development are still  
94 necessary. This may involve exploring alternative materials for more impermeable sampling  
95 bags, improving sealing methods to better isolate sampled air, and developing sampling  
96 techniques less susceptible to diffusion. Resolving these issues is essential for ensuring the  
97 reliability of water vapor isotope measurements using air bags and for accurately understanding  
98 atmospheric and hydrological processes.

99 In light of the ongoing development and further refinement of these techniques and the  
100 associated cost constraints, we developed a diffusion model with parameters calibrated through  
101 laboratory experiments. This model is capable of assessing the permeability of the air bags and  
102 correcting the obtained isotope values to the initial pre-diffusion values based on the humidity,  
103 isotope values inside and outside the bag, and the sample storage time. This diffusion model  
104 was validated through experiments under diverse conditions, confirming its reliability.  
105 Furthermore, we also applied this diffusion method to air samples collected at different altitudes  
106 using a drone-based atmospheric vapor sampling device we developed, to estimate the initial  
107 isotope composition and uncertainty. The primary objective of this drone-based field campaign  
108 is to obtain atmospheric water vapor isotope data along vertical profiles in the troposphere,  
109 providing higher temporal and spatial resolution than satellite observations. The corrected data  
110 for drone-based measurements using our diffusion model show consistency with Picarro direct  
111 observations and satellite data, further confirming the model's theoretical and practical  
112 reliability in applications.

## 113 2 Theoretical basis of diffusion model

### 114 2.1 Diffusion model description

115 Storing vapor samples in air bags prior to isotope measurement may alter the isotopic  
116 composition of the water vapor. The main reason is the diffusion of water molecules between  
117 the interior and exterior of the air bags, primarily due to the permeability of the bag materials.  
118 We present a mathematical model for the diffusion and fractionation of isotopes across the  
119 surface of the sampling bag. In this model, we assume the ambient vapor flux entering the air  
120 bag changes the internal humidity and vapor isotope values, influenced by the different  
121 humidity and water isotope values inside and outside the bag (Fig. 1). Note that we use isotope  
122 ratios ( $R$ ) in the following equations for mathematical convenience and conciseness, but present  
123 isotope values  $\delta$  in figures in subsequent sections for visualization purposes.

124 The flux of water toward the bag,  $F$ , is expressed as:

$$125 \quad F = k * (q_e - q(t)) \quad (1)$$

126 where  $q(t)$  represents the variation of humidity inside the air bag over time (in g/kg),  $q_e$   
127 denotes the environmental humidity (in g/kg), and  $k$  is a constant (in kg/m<sup>2</sup>/s)

128 Similarly, the flux of isotopologue,  $F_i$ , either H<sub>2</sub><sup>18</sup>O or HDO, moving toward the bag can  
129 be described as:

$$130 \quad F_i = k_i * (R_e * q_e - R(t) * q(t)) \quad (2)$$



131 In this equation,  $k_i$  represents a constant specific to each isotopologue,  $R_e$  denotes the  
 132 isotopic ratio in the environment, and  $R(t)$  is the variation of isotopic ratio within the air bag  
 133 with time. Notably, the fractionation coefficient can be denoted by  $\alpha = \frac{k}{k_i}$ .

134  
 135 The temporal change in humidity can be modeled by the following differential equation:

$$136 \quad \frac{d(q(t)*M)}{dt} = F * A \quad (3)$$

137 where  $A$  represents the exchange area (surface area of the air bag), and  $M$  is the air mass  
 138 inside the bag.

139 If  $M$  is constant, this equation simplifies to:

$$140 \quad \frac{dq(t)}{dt} = \frac{F*A}{M} = \frac{k*A}{M} * (q_e - q(t)) \quad (4)$$

141 Here, we define the diffusion coefficient of humidity,  $\frac{k*A}{M}$ , as  $\lambda$ .

142 Similarly, the temporal change in isotopic ratio can be modeled by the following  
 143 differential equation:

$$144 \quad \frac{d(R(t)*q(t)*M)}{dt} = M * (q(t) * \frac{dR(t)}{dt} + R(t) * \frac{dq(t)}{dt})$$

$$145 \quad = F_i * A = k_i * (R_e * q_e - R(t) * q(t)) * A \quad (5)$$

146 This equation can be simplified as:

$$147 \quad \frac{dR(t)}{dt} = \frac{k_i * (R_e * q_e - R(t) * q(t)) * A / M - R(t) * \frac{dq(t)}{dt}}{q(t)}$$

$$148 \quad = \frac{\frac{k*A}{M*\alpha} * (R_e * q_e - R(t) * q(t)) - R(t) * \frac{k*A}{M} * (q_e - q(t))}{q(t)}$$

$$149 \quad = \frac{\frac{\lambda}{\alpha} * (R_e * q_e - R(t) * q(t)) - R(t) * \lambda * (q_e - q(t))}{q(t)} \quad (6)$$

150  
 151 The differential equation for humidity (Eq. 4) can be analytically solved :

$$152 \quad q_e - q(t) = (q_e - q_0) * e^{(-\frac{k*A}{M}*t)} = (q_e - q_0) * e^{(-\lambda*t)} \quad (7)$$

153 where  $q_0$  is the initial humidity at  $t = 0$ . This equation can also be expressed in terms of  
 154 natural logarithms as:

$$155 \quad \ln(q_e - q(t)) = \ln(q_e - q_0) - \lambda * t \quad (8)$$

156 Consequently, the slope of  $\ln(q_e - q(t))$  against time is  $\lambda$ .

157

158 For the isotopic ratio, the analytical solution is only feasible when the initial humidity  
 159 equals the environmental humidity ( $q_0 = q_e$ ) :

$$160 \quad \frac{dR(t)}{dt} = \frac{k*A}{M*\alpha} * (R_e - R(t)) \quad (9)$$

$$161 \quad \text{Thus, } R_e - R(t) = (R_e - R_0) * e^{(-\frac{k*A}{M*\alpha}*t)} \quad (10)$$

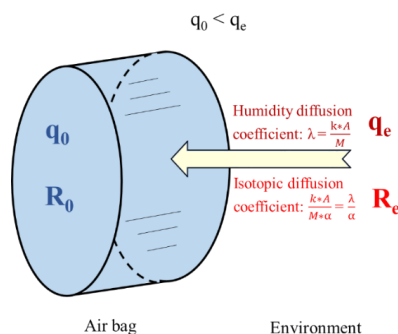
162 where  $R_0$  denotes the initial isotopic ratio at  $t = 0$ . Again, taking the natural logarithm, we  
 163 obtain:



164 
$$\ln (R_e - R(t)) = \ln (R_e - R_0) - \frac{\lambda}{\alpha} * t \quad (11)$$

165 This equation demonstrates that the slope of  $\ln(R_e - R(t))$  against time is the diffusion  
 166 coefficient of isotopic ratio  $\frac{\lambda}{\alpha}$ . Knowing  $\lambda$ , we can deduce the isotopic fractionation coefficient,  
 167  $\alpha$ , for each isotope.

168 However, when the environmental humidity differs from the initial humidity inside the air  
 169 bag, a numerical solution is required to solve the differential equation for  $R$  (Eq. 6).



170

*Figure 1 Schematic illustrating the diffusion model.  $q_0$  represents the initial humidity in the air bag at  $t = 0$ ,  $q_e$  denotes the environmental humidity,  $R_0$  indicates the initial isotopic ratio in the air bag at  $t = 0$ ,  $R_e$  represents the isotopic ratio in the environment,  $k$  is a constant,  $A$  denotes the exchange area (surface area of the bag), and  $M$  is the mass of air within the bag, and  $\alpha$  denotes the isotopic fractionation coefficient.*

171 **2.2 Reconstructing initial water vapor isotopic compositions**

172 The isotopic composition of the air bag water vapor undergoes an exponential evolution  
 173 over time (Eq. 10). This method of applying exponential evolution equations to reconstruct  
 174 isotopic compositions has been used in environmental forensics to investigate shifts in water  
 175 isotopes due to metabolic changes, environmental conditions, or diet (Ayliffe et al., 2004;  
 176 Cerling et al., 2006). Similarly, in climatology, this method helps retrieving initial isotopic  
 177 values from samples such as ice cores or tree rings, affected by evaporation, precipitation, and  
 178 temperature fluctuations, facilitating historical climate reconstruction (Brienen et al., 2016).  
 179 Here we apply a similar method, and apply the analytical solution of Equation 6 using data from  
 180 experiments in which the condition that  $q_0$  equals  $q_e$  is met to determine the equation parameters.

181 The constants ( $\lambda$ ,  $\alpha_{\delta^{18}\text{O}}$ ,  $\alpha_{\delta^2\text{H}}$ ) can be determined through laboratory experiments and  
 182 Equations 8 and 11 (see Subsection 3.2 and 4.1). If we know the initial values within the air  
 183 bag ( $q_0$ ,  $\delta^{18}\text{O}_0$ ,  $\delta^2\text{H}_0$ ), the ambient values ( $q_e$ ,  $\delta^{18}\text{O}_e$ ,  $\delta^2\text{H}_e$ ), and the storage time of the sampling  
 184 bag, we are able to simulate the variations in humidity and isotopic ratios inside the air bag  
 185 according to Equations 4 and 6. Similarly, if we know the storage time, the humidity and  
 186 isotopic values at time  $t$  ( $q(t)$ ,  $\delta^{18}\text{O}_t$ ,  $\delta^2\text{H}_t$ ) in the air bag, and the ambient values, we can deduce  
 187 the initial values in the air bag at  $t = 0$  by back-calculating.



## 188 3 Methods and data

### 189 3.1 Air bag isotope measurements

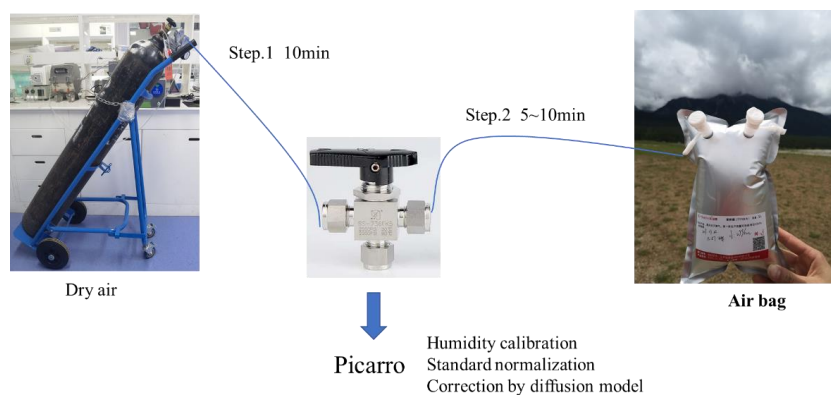


Figure 2 Setup for isotope measurements using air bags with a Picarro atmospheric water vapor isotope analyzer.

190 In this study, we used 0.5 L and 4L Teflon air bags produced by Dalian Hede Technologies  
191 Co., Ltd to collect and store vapor, and measured the vapor isotopes using a Picarro 2130i water  
192 isotope analyzer. Based on our testing and the airflow rate set for the Picarro analyzer, the 0.5  
193 L and 4 L bags provided sufficient sample volume for approximately 25 minutes and 200  
194 minutes of analysis, respectively.

195 Figure 2 illustrates the setup for measuring vapor isotopes in air bags. In this system, the  
196 air inlet of the Picarro isotope analyzer was connected to a three-way valve through Teflon or  
197 stainless steel tubing. The other two ports of the three-way valve were attached to the outlet  
198 valve of the air bag and a dry air cylinder, respectively. Sample storage and measurement were  
199 conducted in a temperature-regulated room to maintain constant temperature conditions for the  
200 air bags and tubing.

201 In the measurement procedure, we first activated the dry air cylinder and adjusted the  
202 pressure reducing valve to set the flow rate at 2 psi (pounds of force per square inch). We then  
203 opened the valve channel connecting the dry air cylinder to the three-way valve, allowing dry  
204 air to flow into the isotope analyzer and flush all air pathways for 10 minutes. Subsequently,  
205 we closed the dry air channel, opened the air bag outlet valve, and the corresponding valve  
206 channel on the three-way valve. This allowed water vapor in the air bags to be analyzed at a  
207 constant temperature in the Picarro analyzer, a process lasting between 5 and 10 minutes. Upon  
208 completion, we switched the valve to measure dry air. By repeatedly measuring isotope values  
209 for parallel samples, we can achieve greater accuracy in the water vapor measurements.

210 To correct the humidity-dependent isotope bias, we applied a calibration function by  
211 measuring vapor isotopes with gradient vapor concentrations set using a standard delivery  
212 module (SDM). We set a reference level of 20,000 ppm for vapor humidity in our analysis,  
213 considering the optimal accuracy of the Picarro analyzer at this specific humidity level



214 (JingfengLiu et al., 2014; Schmidt et al., 2010). All the measured vapor isotope data were  
215 normalized to the VSMOW-SLAP scale using two distinct laboratory waters with known  
216 isotopic values. Before conducting daily measurements, we adjusted the quantity of the injected  
217 liquid standard to align with the humidity of the external vapor measurements.

### 218 3.2 Laboratory permeability experiments

219 To evaluate the variations of the diffusion of water molecules between the interior and  
220 exterior of the air bags, we conducted the following experiments (Table 1), as detailed below:

*Table 1 Summary of experiments: diffusion parameter quantification, model validation and differences in experimental methods.  $\lambda_{\text{surface}}$  denotes the diffusion coefficient of humidity at the surface,  $\alpha_{\delta}$  refers to the fractionation coefficient of isotopes,  $q_0$  represents the initial vapor humidity in the air bags, and  $q_e$  corresponds to the environmental vapor humidity.*

Experiment Number	Experimental purpose	Differences in experimental methods
No. 1	Quantification of $\lambda_{\text{surface}}$	Dry air in the air bags
No. 2	Quantification of $\alpha_{\delta}$	Water vapor with known isotopic compositions in the air bags under the condition $q_0 = q_e$
No. 3	Diffusion model validation	Water vapor with varying isotopic compositions and humidity levels in the air bags

#### 221 3.2.1 Experiment No. 1: Quantification of $\lambda_{\text{surface}}$

222 To quantify the diffusion coefficient of humidity at the surface,  $\lambda_{\text{surface}}$ , using Equation 8,  
223 we filled the empty and clean air bags with dry air and measured humidity variations using a  
224 Picarro analyzer at intervals of 1 minute, 2, 4, 6, 8, and 10 hours following the measurement  
225 method described in Subsection 3.1. Measurements were conducted using 0.5L and 4L air bags,  
226 with repetitions on both identical and different air bags of the same dimensions (refer to the  
227 experiment times in Table 2 and results in Fig.3a ). Results will be shown in Subsection 4.1.

#### 228 3.2.2 Experiment No. 2: Quantification of $\alpha_{\delta}$

229 To investigate isotope variation patterns and improve measurement accuracy during  
230 storage in the air bag to quantify the isotopic fractionation coefficient,  $\alpha$ , using Equation 11,  
231 initial values significantly different from ambient conditions were selected. Empty, clean air  
232 bags were filled with dry air, followed by the injection of a fixed amount of water with known  
233 isotopic values, ensuring that  $q_0$  was approximately equal to  $q_e$ . To ensure  $q_0 = q_e$ , the  
234 environmental vapor concentration was first measured, followed by the calculation and  
235 experimental determination of the water volume to be injected into the air bag. Water vapor  
236 concentration and isotope variations within the air bags were then measured using a Picarro  
237 analyzer at intervals of 5 minutes, 2, 4, 6, 8, and 10 hours. Results will be shown in Subsection  
238 4.1. To ensure data consistency and reliability, we repeated these measurements multiple times





239 using air bags of both the same and different sizes, including 0.5L and 4L bags. For the 0.5L air  
240 bags, a separate bag was prepared for each time interval, and water vapor concentration and  
241 isotopic compositions were measured once to ensure that the parameter  $M$  remained stable  
242 without being affected by repeated measurements. However, manual injection of water with  
243 known isotopic values introduced some variability, making it difficult to ensure identical initial  
244 conditions across all bags. To address this, we repeated the experiment with 4L air bags,  
245 measuring the same air bag at different time intervals, which ensured consistent initial  
246 conditions at  $t=0$  but allowed  $M$  to change over time. When air bags differ only in size, the  
247 parameter  $\lambda$  associated with  $A$  varies, while the isotopic fractionation coefficient  $\alpha$  is  
248 theoretically constant. Both approaches could contribute to uncertainties in the mismatches  
249 between the model and experimental results. Therefore, we incorporated the results from both  
250 the 0.5 L and 4 L experiments into our uncertainty estimation of these mismatches, as detailed  
251 in Subsections 3.2.3 and 3.4.2.

### 252 **3.2.3 Experiment No. 3: Diffusion model validation**

253 To validate the diffusion model under diverse conditions and evaluate its uncertainties, we  
254 repeated Experiment No. 2, but injected different amounts of water with known isotopic values  
255 to achieve a range of humidities from approximately  $1/8 * q_e$  to  $q_e$ . Additionally, we used water  
256 with different isotopic values to replicate the experiment. To assess extended-duration  
257 variations, we also lengthened the time interval to 24 hours.

258 Once the parameters of the diffusion model have been obtained through Experiments No.  
259 1 and 2, we can use this model to simulate the variations in water vapor humidity and isotope  
260 values inside the air bag over time for Experiments No. 2 and 3 (refer to Section 2). When  
261 simulating these experiments using the diffusion model, we used measurements taken after a  
262 5-minute delay as the initial condition to ensure that it represented complete evaporation of the  
263 injected water. We then simulated the temporal variations in humidity and vapor isotopes within  
264 the air bag using a 5-minute time step. Results will be shown in Subsection 4.2.

### 265 **3.3 Drone-mounted systems and field campaign**

266 We designed and constructed a collection module for fixed-height sampling at  
267 predetermined altitudes, using air pumps and a rudder mounted on the drone, along with a  
268 control module linked to a remote operating system. However, as air pressure increases during  
269 the drone's descent after collection, the air bags may deflate, potentially causing leakage of the  
270 collected air samples. To address this, we installed a one-way valve that permits only air entry  
271 into the bag, thus preventing backflow. Additionally, the one-way valve helps prevent large  
272 droplets from entering the air bag during the collection process.

273 The sampling module was mounted on our specially designed high-altitude drones and  
274 deployed during a field campaign in the pristine forests region of Mountain Laojun, Lijiang, on  
275 the southeastern edge of the Tibetan Plateau and the northwestern of the Yunnan-Guizhou  
276 Plateau, China, throughout the period from June 25, 2020, to October 17, 2020.

277 By integrating high-altitude drone sampling with in-situ water vapor isotope  
278 measurements at the surface, we obtained vapor isotopic profiles up to an altitude of 11 km.



279 Unlike conventional methods, such as cryogenic vapor sampling, this approach requires much  
280 less sample volume and allows for in-situ measurements. Additionally, compared to large  
281 aircraft, airships, and balloon-based observations, this method is relatively low-cost and  
282 supports more flexible and long-term observations.

### 283 3.4 Application of diffusion model to vertical profiles

#### 284 3.4.1 Estimating the air mass in the bag

285 For the vertical profile samples collected using drones, since  $\lambda$  ( $k \cdot A/M$ ) depends on  $M$ , and  
286  $M$  acquired by the sampling bag varies due to different sampling altitudes with varying air  
287 pressure,  $\lambda$  consequently varies with altitude as well. However, it is difficult to experimentally  
288 estimate  $\lambda$  for different altitudes ( $\lambda_{alt}$ ); instead, we estimated it from the variation of the  
289 collected  $M$ .

290 At higher altitudes, where the air pressure ( $P_{alt}$ ) is lower than at the surface ( $P_{surface}$ ), less  
291 air will be pumped into the air bag. To compensate for this effect, a longer sampling time was  
292 used at higher altitudes (Sampling time<sub>alt</sub>) than at the surface (Sampling time<sub>surface</sub>) (Fig.A1).  
293 Therefore,

$$294 M_{alt} = M_{surface} * \frac{P_{surface}}{P_{alt}} * \frac{\text{Sampling time}_{alt}}{\text{Sampling time}_{surface}} \quad (12)$$

295 where  $M_{alt}$  is the air mass collected at a different altitude and  $M_{surface}$  represents the air  
296 mass collected at the surface.

297 Therefore, the  $\lambda$  at a higher altitude ( $\lambda_{alt}$ ) can be estimated as:

$$298 \lambda_{alt} = \lambda_{surface} * \frac{P_{surface}}{P_{alt}} * \frac{\text{Sampling time}_{alt}}{\text{Sampling time}_{surface}} \quad (13)$$

299 where  $\lambda_{surface}$  is the  $\lambda$  quantified experimentally at the surface.

300 All sampling times were recorded during in-situ sampling. Given the variables  $\lambda_{surface}$ ,  
301 Sampling time<sub>alt</sub>, Sampling time<sub>surface</sub>,  $P_{surface}$  and  $P_{alt}$ ,  $\lambda_{alt}$  at different altitudes can be  
302 estimated using Eq. 13. The observed vertical profiles of vapor isotopes can then be corrected  
303 using the diffusion model described in Section 2 and quantified in Subsection 3.2. These  
304 estimates are subject to uncertainties, which will be discussed in the subsequent section 3.4.2.

#### 305 3.4.2 The method of uncertainty estimation

306 Potential sources of error in the diffusion model correction process include estimates of  
307  $\lambda_{surface}$ ,  $\alpha_{\delta}$ ,  $\lambda_{alt}$ , and from mismatches between model and experiments (Table 2).

308 For  $\lambda_{surface}$ , the uncertainty range was estimated through laboratory experiments by  
309 considering the minimum and maximum values obtained. The results are presented in  
310 Subsection 4.1.

311 For  $\alpha_{\delta}$ , the average values of  $\lambda$  and  $\lambda/\alpha$  were estimated from several experiments, and  
312 then  $\alpha$  can be calculated. The results are presented in Subsection 4.1. In Subsection 4.2, we  
313 observed that the values simulated by the model closely track the experimental results, thereby  
314 validating the accuracy of our parameter selection. For the uncertainty range of  $\alpha_{\delta}$ , it is also



315 essential to first validate the parameters derived from the experiments. As highlighted in  
 316 Subection 3.2.2, estimating  $\lambda\alpha$  (and subsequently calculating  $\alpha$ ) requires results from cases  
 317 where  $q_0$  equals  $q_e$ . However, in these numerous experiments, it cannot be guaranteed that all  
 318  $q_0$  exactly equal  $q_e$ , and  $q_e$  can exhibit temporal variations, leading to non-systematic  
 319 discrepancies between the model and experimental data. Consequently, for analyzing the  
 320 contribution of  $\alpha$  to uncertainties, only  $\alpha$  values derived from experiments where the model  
 321 closely matched the majority of experimental results were considered. Selection criteria for  
 322 these experiments included minimal deviation between  $q_0$  and  $q_e$ , minimal deviation between  
 323 experimental data and simulations, and stable  $q_e$  values, ensuring the reliability of the chosen  $\alpha$   
 324 values.

325 Regarding the sampling time, we note that using the same air pump to extract air under  
 326 varying atmospheric pressures for an identical duration may result in different air mass,  $M$ . To  
 327 compensate for this potential variability, we incorporated a larger margin of error for the  
 328 recorded sampling time. Consequently, when calculating  $\lambda_{alt}$  using Equation 13, we considered  
 329 a relative uncertainty of  $\pm 1/4$  of the recorded sampling time.

330 To address the mismatch between the model and the experiment, we gathered all  
 331 experimental data and conducted simulations using the diffusion model. We simulated  
 332 variations in humidity and isotopic composition based on the initial values within the air bag,  
 333 ambient conditions, and the storage time of the sampling bag, as described in Subsection 2.2.  
 334 We then calculated the differences between the simulations and the experimental data for each  
 335 corresponding storage time. Finally, we computed the average of all these differences for each  
 336 parameter separately. The results are presented in Subsection 4.2.

337 To evaluate the total error, we computed the maximum discrepancy between all calibration  
 338 results, which used the uncertainty ranges of the first three potential sources mentioned above,  
 339 and the corrected data employed. To this value, we added the fourth error source, which is the  
 340 mismatch observed between the model and the experiments. The final uncertainties present in  
 341 Subsections 4.3 and 4.5 represent the maximum error derived from all four error sources.

Table 2 Uncertainty sources and estimation methods

Uncertainty sources	Number of experiments	Estimation method	Used value (min~max for error estimation)
$\lambda_{surface}$	7; 6	Obtained from lab experiments (max & min)	For 0.5L air bags: 0.031(0.0291~0.0317); For 4L air bags: 0.0255(0.0250~0.0259)
$\alpha_{\delta}$	4	Obtained from lab experiments	$\alpha_{\delta^{18}O}$ is 1.0241, $\alpha_{\delta^2H}$ is 1.0451 ( $\alpha_{\delta^{18}O}$ is 1.0254, $\alpha_{\delta^2H}$ is 1.0506 and $\alpha_{\delta^{18}O}$ is 1.0264, $\alpha_{\delta^2H}$ is 1.0380)
Sampling time <sub>alt</sub>	-	Recorded sampling time	$\pm 1/4$
Mismatches between model and experiments	87	Average of all difference between experimental data and simulations	0.5 ‰ for $\delta^{18}O$ , 4.1 ‰ for $\delta^2H$ , 2.9 ‰ for d-excess

342



---

### 343 3.5 Satellite isotope data IASI

344 Of the available instruments, the Infrared Atmospheric Sounding Interferometer (IASI)  
345 offers the best spatiotemporal coverage for  $\delta^2\text{H}$  retrieval (Lacour et al., 2012; Lacour et al.,  
346 2018). It has a horizontal footprint of approximately 12 km at nadir (directly below the satellite),  
347 increasing with the angle of observation. This configuration ensures nearly global coverage  
348 twice daily.

349 In this study, we compared our observed vapor  $\delta^2\text{H}$  profiles up to the upper troposphere  
350 with satellite observations. Due to the intermittent availability of IASI data at any given location,  
351 we limited our comparison of observational results across various altitudes at our study site to  
352 days when IASI data were available. Satellite measurements, particularly for water vapor  
353 isotopes, typically have limited vertical resolution. The IASI satellite instrument provides water  
354 vapor isotope data at three altitude levels: 1-3 km in the lower troposphere, 4-7 km in the mid-  
355 troposphere, and 8-12 km in the upper troposphere. Given that our study started at an altitude  
356 of 3856 m, we used the retrieved  $\delta^2\text{H}$  data for the 4–7 km and 8–12 km levels. However, these  
357 measurements represent a vertical average over layers determined by the averaging kernels  
358 (Rodgers and Connor, 2003; Worden et al., 2006). While using averaging kernels to smooth the  
359 observed profile could facilitate a more quantitative analysis, we simply averaged the  
360 observations for the corresponding altitudes. Consequently, the comparison remains mainly  
361 qualitative.

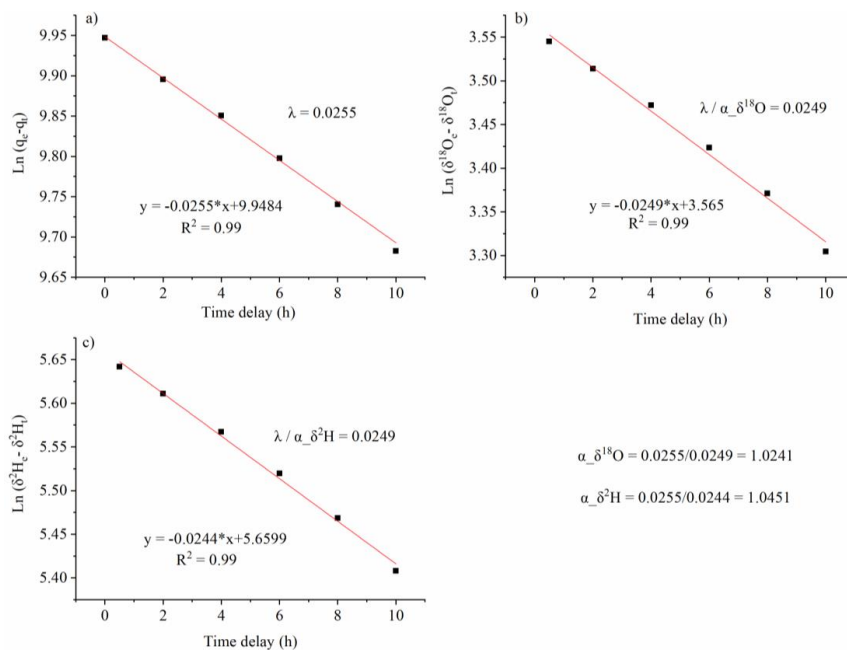
## 362 4 Results

### 363 4.1 Parameter estimates

364 The  $\lambda_{\text{surface}}$  was determined through laboratory Experiment No. 1. Based on Equation 8,  
365 the parameter  $\lambda_{\text{surface}}$  was estimated to be 0.0312 (uncertainty range: 0.0291 to 0.0317) for  
366 the 0.5 L air bags and 0.0255 (uncertainty range: 0.0250 to 0.0259) for the 4 L air bags (Fig. 3a,  
367 Table 2).

368 The isotopic fractionation coefficients,  $\alpha$ , were determined through laboratory Experiment  
369 No. 2. From the averaged results of these measurements, using Equation 11, the diffusion  
370 coefficient of isotopic composition, expressed as  $\lambda/\alpha$ , was estimated to be 0.0249 for  $\delta^{18}\text{O}$  and  
371 0.0244 for  $\delta^2\text{H}$  (Fig. 3b and c). Consequently,  $\alpha_{\delta^{18}\text{O}}$  was estimated to be 1.0241  
372 (0.0255/0.0249), and  $\alpha_{\delta^2\text{H}}$  was estimated to be 1.0451 (0.0255/0.0244) (Fig. 3b and d). Two  
373 additional sets of fractionation coefficients,  $\alpha$ , were obtained:  $\alpha_{\delta^{18}\text{O}} = 1.0254$ ,  $\alpha_{\delta^2\text{H}} = 1.0506$ ,  
374 and  $\alpha_{\delta^{18}\text{O}} = 1.0264$ ,  $\alpha_{\delta^2\text{H}} = 1.0380$  (Table 2).

375 These parameters determined were influenced by factors such as the type and material  
376 composition of the air bags and ambient temperature. The acquired parameters specifically  
377 pertained to the Teflon air bags used in the aforementioned tests, conducted at an ambient  
378 temperature of 16°C. We observed some differences between batches of air bags from the same  
379 manufacturer, which are worth noting. The primary objective of this study was to establish a  
380 methodology.



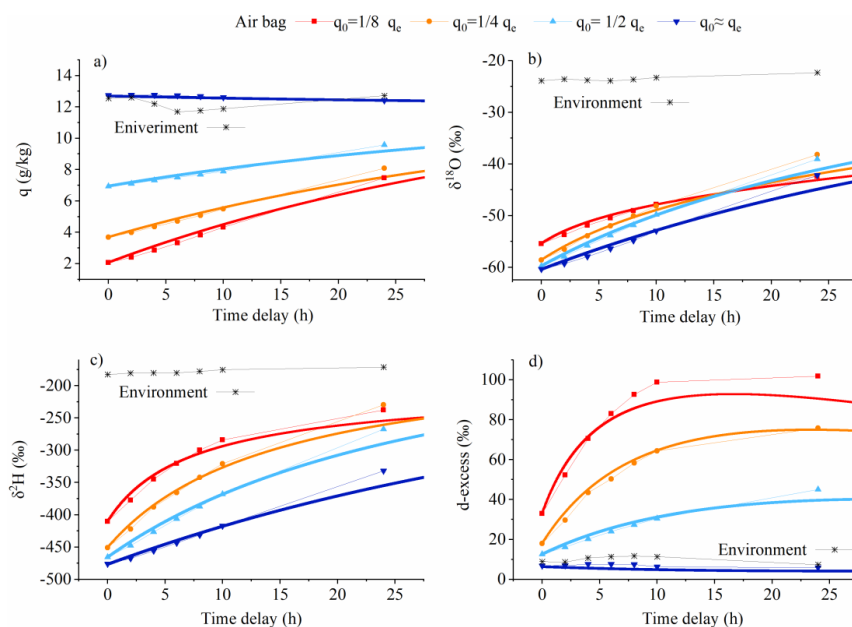
381

Figure 3 Determination of 3 parameters of the diffusion model :  $\lambda_{\text{surface}}$  (a),  $\alpha_{\delta^{18}\text{O}}$  (b), and  $\alpha_{\delta^2\text{H}}$  (c).



## 382 4.2 Diffusion model validation

### 383 4.2.1 General case



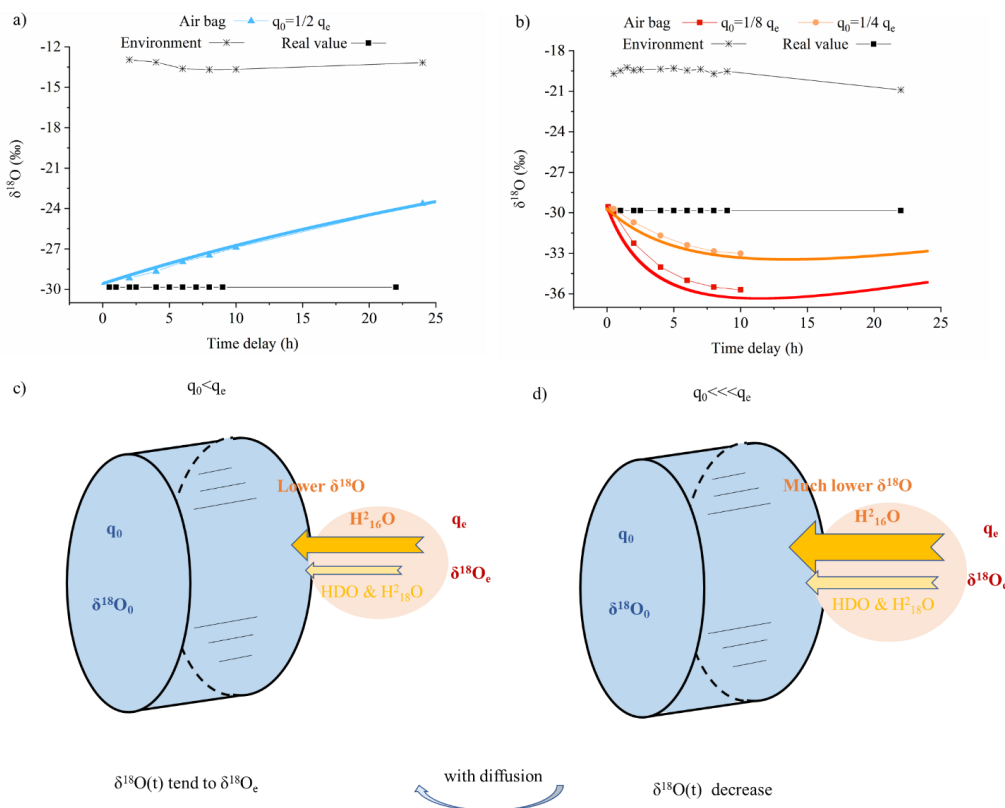
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Figure 4: Comparison of the variation within the air bag over time in laboratory permeability experiments (markers) and diffusion model simulations (lines) across a range of initial humidities at  $t = 0$  ( $q_0$ ), ranging from approximately  $1/8 * q_e$  to  $q_e$  ( $q_e$  denotes the environmental humidity), under the condition that the water vapor isotopic composition in the air bag significantly differs from ambient values : a) humidity; b)  $\delta^{18}O$ ; c)  $\delta^2H$ , d) d-excess.

385 To validate the model, we used Experiment No.3 described in Subsection 3.2. The  
386 simulations from our diffusion model are in close agreement with our experimental  
387 observations, with only minor deviations (Fig.4). Shorter storage times produce fewer  
388 deviations. When the humidity inside the air bag is lower than the ambient level, vapor from  
389 the environment enters the air bag, resulting in a gradual increase in humidity (Fig. 4a).  
390 Meanwhile, because the water vapor isotopic composition in the air bag is significantly lower  
391 than the ambient values,  $\delta^{18}O$  and  $\delta^2H$  in the air bag gradually increase and toward ambient  
392 values as ambient moisture enters the bags over time (Fig. 4b and c). In contrast, the d-excess  
393 values increase as the time delay progresses due to kinetic fractionation during moisture  
394 diffusion into the air bag (Fig. 4d), as detailed in the following Subsection 4.2.2.



395 **4.2.2 Particular cases**



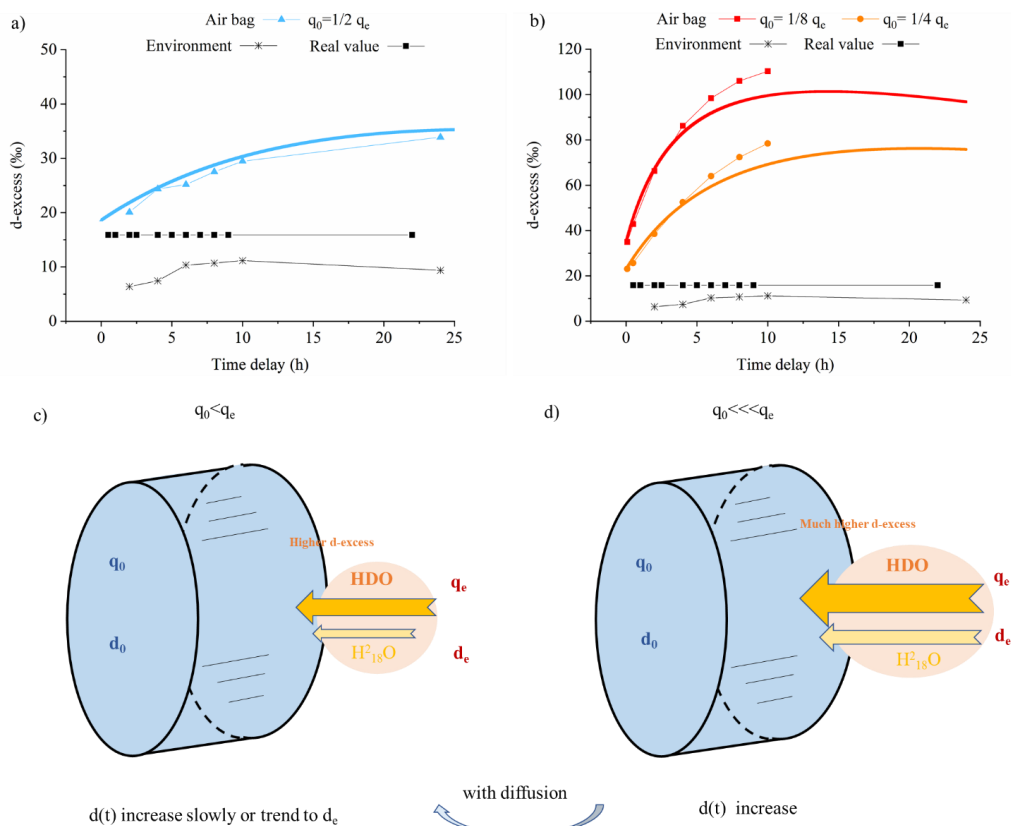
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Figure 5 (a, b) Variations of  $\delta^{18}\text{O}$  under different conditions: (a) the differences between internal ( $\delta^{18}\text{O}_0$ ) and external ( $\delta^{18}\text{O}_e$ )  $\delta^{18}\text{O}$  values as well as between internal ( $q_0$ ) and external ( $q_e$ ) humidity are not significant; (b) the difference between  $\delta^{18}\text{O}_0$  and  $\delta^{18}\text{O}_e$  is less pronounced, and  $q_0$  is significantly lower than  $q_e$ . (c,d) Corresponding schematic illustrations of the underlying mechanisms for (a) and (b).  $\delta^{18}\text{O}(t)$  is the variation of  $\delta^{18}\text{O}$  within the air bag over time.

397 Due to isotopic kinetic fractionation,  $\text{H}_2^{16}\text{O}$  molecules preferentially diffuse into the air  
 398 bag compared to  $\text{HDO}$  and  $\text{H}_2^{18}\text{O}$ , resulting in a vapor flux with lower  $\delta^{18}\text{O}$  (Fig. 2). Moreover,  
 399 variations within the air bag are driven by differences in water vapor content and isotopic ratios  
 400 between its interior and exterior, as described in the diffusion model in Section 2. As shown in  
 401 the first scenario in Figure 4b and c: when the internal  $\delta^{18}\text{O}$  and  $\delta^2\text{H}$  values are significantly  
 402 below the ambient values, the  $\delta$ -values of the diffusing vapor, although lower than ambient,  
 403 still exceeds the initial internal  $\delta$ -values, leading to a gradual increase towards the ambient  
 404 values; diffusion simply equilibrates the isotopic composition in the bag and the environment.  
 405 Similarly, in the second scenario in Figure 5a and c, when the disparity between internal and  
 406 external  $\delta^{18}\text{O}$  and  $\delta^2\text{H}$  values is not very substantial, and humidity differences are also minimal,



407 the weaker diffusive gradient produces less net kinetic fractionation. This results in a small  
 408 amount of vapor with lower  $\delta^{18}\text{O}$  and  $\delta^2\text{H}$  values entering preferentially, but not falling below  
 409 internal initial values, thereby driving a progressive increase in the internal values towards  
 410 ambient values as in the first scenario. In contrast, in the third scenario in Figure 5b and d, with  
 411 the same initial contrast between internal and ambient  $\delta$ -values, that is, the disparity between  
 412 internal and external  $\delta^{18}\text{O}$  and  $\delta^2\text{H}$  values is less pronounced, but  $q_0$  is much lower than  $q_e$ , there  
 413 is a stronger net flux into the bag, and this flux fractionates more rapidly; much more vapor  
 414 with significantly lower  $\delta^{18}\text{O}$  and  $\delta^2\text{H}$  values than the ambient moisture (and lower values than  
 415 the initial internal vapor) enters the air bags and dominates their isotopic composition, thereby  
 416 reducing the internal  $\delta$ -values. As diffusion progresses, the difference in humidity and isotopic  
 417 composition between the inside and outside of the air bag decreases, causing the third scenario  
 418 to evolve into the second scenario. The smaller the difference in humidity and isotopic  
 419 composition between the inside and outside of the air bag, the slower and smaller the isotopic  
 420 change in the vapor within the air bag (Fig. 5 and Fig. 6).



421

Figure 6 (a-b) Evolution of  $d$ -excess in cases: (a) the difference between the humidity inside ( $q_0$ ) and outside ( $q_e$ ) the air bag is not significant; (b)  $q_0$  is significantly lower than  $q_e$ . (c-d) Corresponding schematic illustrations of the underlying mechanisms for (a) and (b).  $d_0$  indicates the initial  $d$ -excess value at  $t = 0$ ,  $d_e$  represents the  $d$ -excess in the environment.  $d(t)$  denotes the variation of  $d$ -excess within the air bag over time.



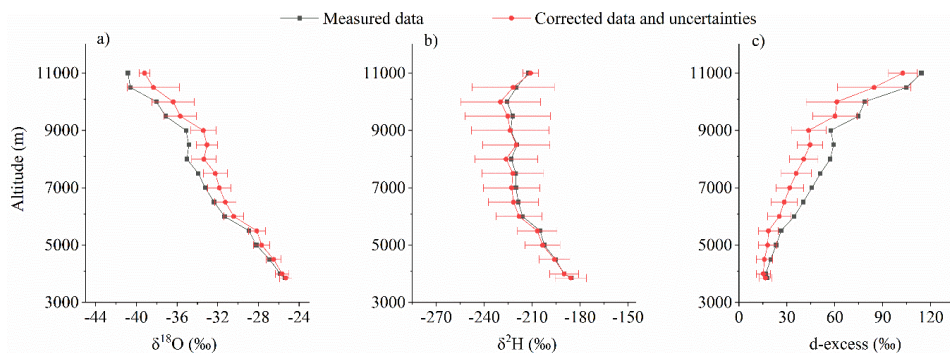


422 In addition, because HDO and H<sub>2</sub><sup>18</sup>O diffuse at similar rates the magnitude of the kinetic  
423 fractionation for D and <sup>18</sup>O is similar. However, since d-excess reflects deviations relative to  
424 the 8:1 fractionation ratio typical of equilibrium processes, the tendency is for kinetic  
425 fractionation during diffusion to contribute vapor with high d-excess and cause an increase in  
426 d-excess during air bag storage as water vapor is added to the bag (Fig. 6a and c). When the  
427 humidity difference between the inside and outside of the air bag increases, the d-excess of the  
428 incoming vapor flux increases as a result of more intensive kinetic fractionation. This leads to  
429 a faster increase in the vapor d-excess value inside the air bag (Fig. 6b and d).

430 In all scenarios, regardless of the differences in water vapor humidity and isotopic  
431 compositions inside and outside the air bag, the diffusion model simulations closely match the  
432 experimental observations (Figs.5 and 6). Using the method described in Subsection 3.4.2, the  
433 average difference between all simulations and experimental data for each parameter  
434 represented the model-experiment mismatch: 0.5 ‰ for δ<sup>18</sup>O, 4.1 ‰ for δ<sup>2</sup>H, and 2.9 ‰ for d-  
435 excess.

### 436 4.3 Raw and corrected vertical profiles

437 Here, we present a summary of drone-based observations from the field campaign at Mount  
438 Laojun, Lijiang, on the southeastern edge of the Tibetan Plateau and the northwestern of the  
439 Yunnan-Guizhou Plateau, China, conducted between June 25, 2020, and October 17, 2020. In  
440 this dataset, acquired from the drones observations and subsequently corrected using the  
441 diffusion modeling, data points with d-excess values less than 1‰ were omitted, as these values  
442 are unrealistic and likely result from overcorrection of the δ-values. This resulted in the  
443 exclusion of 6 out of 1039 samples.



444

*Figure 7 Comparison of vertical profiles for the mean values of all raw measurements and corrected data from June to October, and associated uncertainties for δ<sup>18</sup>O (a), δ<sup>2</sup>H (b) and d-excess (c).*

445 As altitude increases, vapor δ<sup>18</sup>O and δ<sup>2</sup>H values decrease due to condensation and  
446 precipitation processes that occur as air masses ascend, which preferentially remove heavier  
447 isotopes following Rayleigh distillation (Dansgaard, 1964). Meanwhile, the d-excess value  
448 rises. This pattern aligns with previous observations in the lower troposphere (He and Smith,  
449 1999; Salmon et al., 2019) and simulations of complete vertical profiles (Bony et al., 2008).

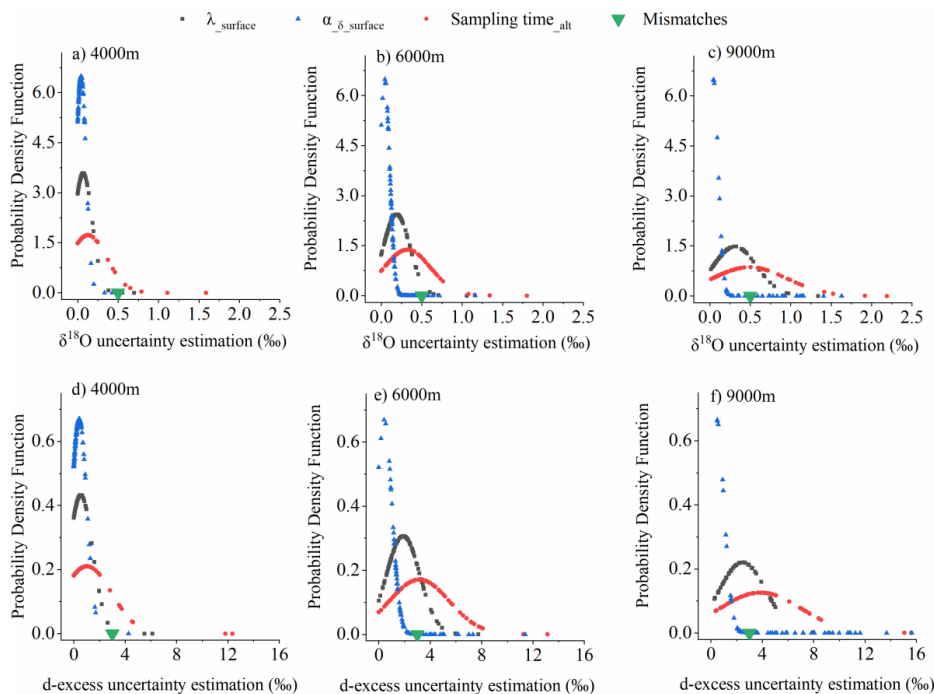


450 In our observations, the variation in  $\delta^{18}\text{O}$  across the vertical profile from ground level at  
451 3856 meters to 11 km is approximately 10-15‰. However, as altitude increases, the air becomes  
452 progressively drier, leading to a greater disparity in humidity between the air collected in the  
453 air bag and the surface storage environment. This aligns with the third scenarios in Subsection  
454 4.2.2 (Figs. 5b, 5d, and 6b, 6d). The strong kinetic fractionation driven by the diffusion of air  
455 into the air bag results in a reduction of the water vapor  $\delta^{18}\text{O}$  within the bag. After applying  
456 model corrections, the initial vapor  $\delta^{18}\text{O}$  inside the air bag were slightly increased. As described  
457 in Subsection 4.2, during storage in the air bag, vapor flux with higher d-excess increases the  
458 d-excess in the air bags. As a compensation, the diffusion model applies corrections, resulting  
459 in a reduced d-excess value after correction (Fig. 7c and 10).

#### 460 4.4 Uncertainty estimates

461 According to the method of uncertainty estimation elaborated in Subsection 3.4.2, we  
462 determined the ranges for four error sources to evaluate uncertainty (Table 2).

463



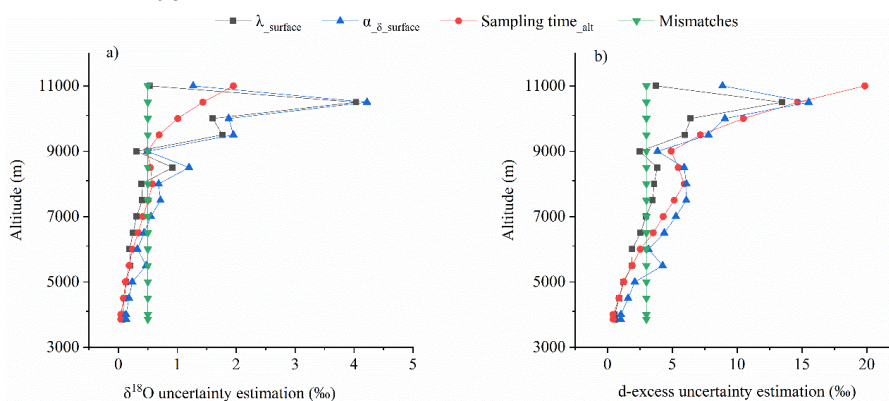
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Figure 8: Contributions of different sources of uncertainty for  $\delta^{18}\text{O}$  (a, b, c for 4000m, 6000m, 9000m, respectively) and d-excess (d, e, f for 4000m, 6000m, 9000m, respectively). The green triangle shows the average mismatch between the model and experimental results.

465 We analyzed the contributions of uncertainty sources to vertical vapor  $\delta^{18}\text{O}$  and d-excess  
466 measurements at different altitudes using probability density function plots (Fig. 8). The  
467 mismatch between the model and the experiment (green marker), calculated using the method



468 described in Subsection 3.4.2, is assumed to remain constant across all altitudes. The other three  
469 error sources manifest as unimodal normal distributions at various altitudes for both  $\delta^{18}\text{O}$  and  
470 d-excess. Errors due to uncertainties in Sampling time<sub>alt</sub> are the main source, exhibiting the  
471 largest spread (Fig. 8) and increasing with altitude (Fig. 9). Errors derived from  $\lambda_{\text{surface}}$  and  $\alpha_{\delta}$   
472 values also increase with altitude (Figs. 8 and 9). This pattern emerges because, estimating  $\lambda_{\text{alt}}$   
473 correlated with M based on  $\lambda_{\text{surface}}$ , with M at high altitude derived from the Sampling time<sub>alt</sub>  
474 using Equation 13. This approach can introduce more significant errors at higher altitudes. As  
475 altitude increases, the humidity and isotopic disparity between the air captured in the air bag  
476 and lower-altitude ambient conditions widens, requiring more intensive corrections.  
477 Consequently, both the uncertainty (Figs. 8 and 9) and the magnitude of the diffusion correction  
478 (Fig. 7) increase with altitude. Overall, the total error remains within 1‰ for  $\delta^{18}\text{O}$  and 8‰ for  
479 d-excess across 98% of the data.



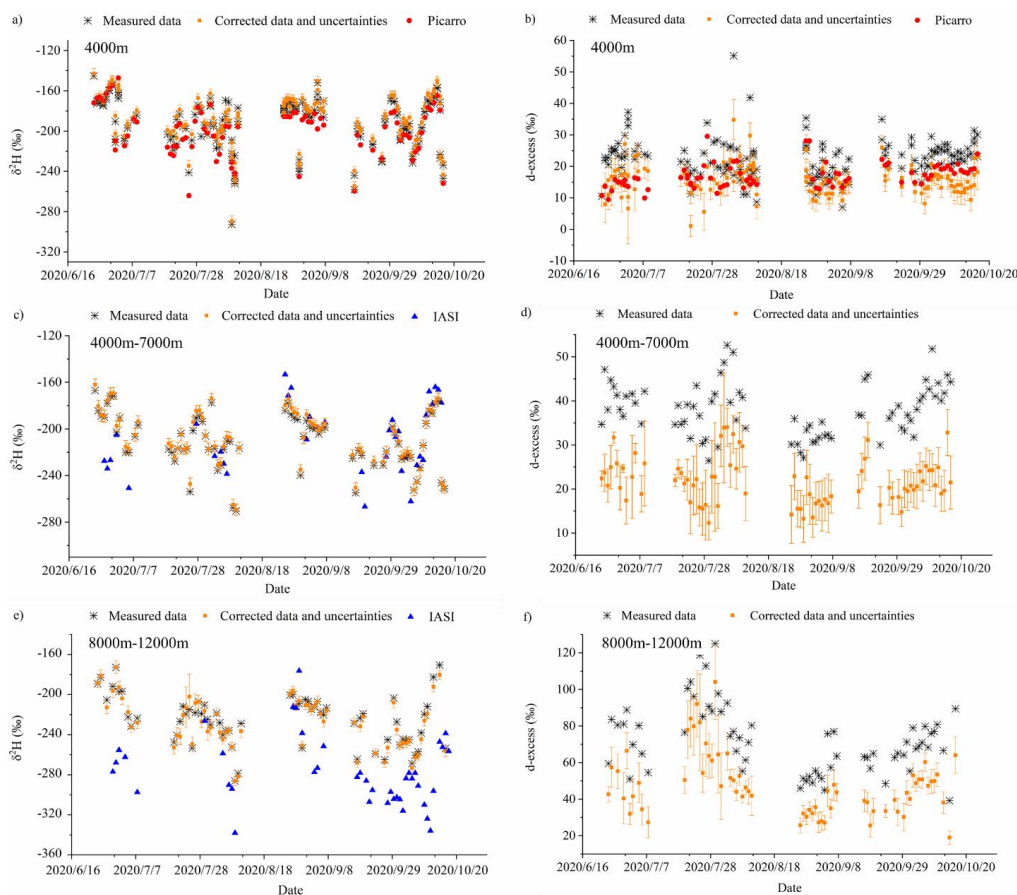
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Figure 9 Mean uncertainty of  $\delta^{18}\text{O}$  (a) and d-excess (b) with altitude for different sources.

481 On the contrary, errors pertaining to  $\lambda_{\text{surface}}$  and  $\alpha_{\delta}$  diminish at altitudes exceeding 10,500  
482 meters. This phenomenon may be attributed to our sampling methodology. Although we  
483 collected air samples in sequence from low to high altitudes, these samples were measured in  
484 reverse order, from high to low altitudes. Consequently, samples taken from the highest  
485 altitudes had the shortest storage durations, typically ranging from 10 minutes to two hours.  
486 Additionally, we extended the sampling times with increasing altitude (Fig. A1). These  
487 extended sampling periods and reduced storage durations help to partially offset the amplified  
488 disparities observed between the raw and corrected profiles at higher altitudes. During the  
489 drone's descent, which lasted around 10 minutes, the external conditions impacting the air bags  
490 were not the ground-level environmental values used in the model but rather those of the  
491 vertical profile. However, the humidity at higher altitudes is lower than at ground level, and the  
492 isotopic values are closer to those inside the airbag. Consequently, its impact on the airbag's  
493 internal conditions is less significant than suggested by using ground-level environmental  
494 values. Therefore, the overestimated error in our model accounted for these potential  
495 discrepancies.



496 4.5 Comparison with Picarro measurements and satellite data



497

Figure 10 Time series comparison for  $\delta^{18}\text{O}$  (a, c, e) and  $d\text{-excess}$  (b, d, f):

(a, b) Raw and corrected (with uncertainties) altitude-averaged air bag measurements from 3856 m to 4000 m, compared with direct Picarro observations at 3856 m.

(c, d) Raw and corrected (with uncertainties) altitude-averaged air bag measurements from 4000 m to 7000 m, compared with satellite data (IASI).

(e, f) Raw and corrected (with uncertainties) altitude-averaged air bag measurements from 8000 m to 12000 m, compared with satellite data (IASI).

498 The left panel of Figure 10 (Fig. a, c, and e) shows the comparison of raw and corrected  
499 water vapor  $\delta^{18}\text{O}$  measurements at different altitudes with direct Picarro observations or IASI  
500 satellite data at corresponding altitudes. There is notable agreement between the raw  
501 measurements and corrected  $\delta^{18}\text{O}$  for altitudes 3856-4000m and the water vapor  $\delta^{18}\text{O}$  observed  
502 directly by Picarro at ground level (3856m) (Fig.10a). To compare corrected measurements  
503 with independent observations at higher altitudes, we refer to the IASI satellite dataset. We



504 acknowledge that this comparison is complicated by differences in measurement footprints  
505 (both horizontal and vertical) and spatio-temporal sampling disparities (Shi et al., 2020).  
506 Therefore, this comparison remains qualitative. For most intervals, IASI satellite data closely  
507 matches raw and corrected  $\delta^{18}\text{O}$  measurements for altitudes 4000–7000m. In the 8000–12000m  
508 range, IASI data is lower than  $\delta^{18}\text{O}$  observations during certain periods, particularly June and  
509 September 2020. While the IASI data closely matches the observed  $\delta^{18}\text{O}$  values for all other  
510 periods in the 4000–7000 meter range, it is also lower in June 2020. A more quantitative  
511 analysis could be facilitated if an averaging kernel is used to smooth the observed profiles  
512 (Herman et al., 2014). All comparisons reflect consistent temporal variations.

513 The right panel of Figure 10 (Fig. b, d, and f) shows the comparison of raw and corrected  
514 vapor d-excess measurements. In the 4000m observations (Fig. b), raw d-excess values in air  
515 bags were higher than corrected values due to kinetic fractionation during diffusion. After  
516 correction, d-excess values decrease and are similar to surface direct Picarro observations at  
517 3856 m. For the 4000–7000m and 8000–12000m observations, no d-excess dataset is available  
518 for comparison (Fig. 10d and f). As previously noted, raw d-excess values are higher than  
519 corrected data due to kinetic fractionation. After correction, d-excess decreases. For the 8000–  
520 12000 m observations, the correction magnitude is smaller than at lower altitudes due to the  
521 shorter storage time of the air bags.

## 522 **5 Conclusion**

523 High spatial and temporal resolution water vapor isotope data are critical for understanding  
524 various hydrologic cycle processes. However, observations of vertical water vapor isotope  
525 profiles are scarce, particularly in the upper troposphere. Satellite-derived vapor isotope data  
526 are available only at limited vertical and temporal resolutions. Acquiring high-resolution water  
527 vapor isotope data, especially under conditions where direct measurements are difficult, has  
528 been a significant challenge for the water isotopes research community. This study  
529 demonstrates the potential of a drone-based air bag sampling method to overcome this  
530 challenge and offers solutions for evaluating air bag suitability and addressing air bag  
531 permeability.

532 While air bags offer the advantage of sample collection, their inherent permeability can  
533 affect the sealing integrity of the samples, leading to potential contamination. The permeability  
534 of airbag materials varies, with some exhibiting lower levels. We recommend prioritizing the  
535 use of glass containers and air bags with the lowest permeability for collecting water vapor  
536 using portable devices. Additionally, it is essential to conduct the permeability experiments  
537 described in this article before any experimental undertaking. This involves storing water vapor  
538 with known isotopic values in the portable collection device for an extended period and then  
539 re-measuring these values to assess or determine the device's permeability parameters.

540 To further address the permeability challenge, we developed a mathematical model to  
541 evaluate and correct for diffusion and isotopic fractionation, ensuring the reliability of vapor  
542 isotope measurements using air bags. Calibrated with parameters from laboratory experiments,  
543 our correction model reconstructs the initial isotopic composition of sampled vapor by using  
544 data from both the air bag and the surrounding environment, offers a practical solution to the

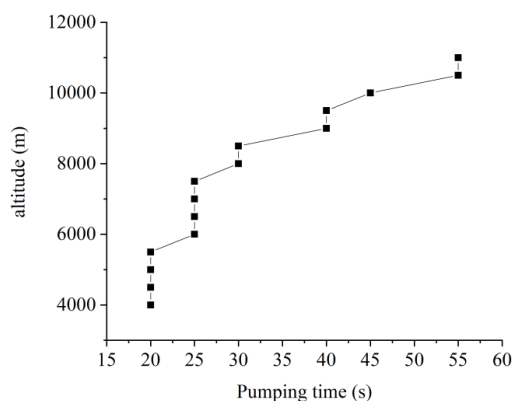


545 prevalent permeability challenges. This model was rigorously validated against observational  
546 experiments conducted under varying conditions. We also applied this model to drone-collected  
547 samples at various pressures. By estimating uncertainty and comparing corrected data with  
548 satellite observations, we validated the reliability and applicability of drone-based water vapor  
549 isotope measurements.

550 Our drone-based sampling system, combined with the diffusion model, effectively  
551 addresses the limitations of traditional laser spectroscopy methods, meeting the need for  
552 lightweight equipment and providing a more economical, efficient, and flexible solution for  
553 high-altitude water vapor measurements compared to traditional methods involving large  
554 aircraft, airships, and balloons. This approach enables us to exploit the benefits of drone-based  
555 air bag sampling while effectively mitigating its potential limitations. This strategy significantly  
556 broadens its potential applications across various environments, thereby enhancing the range  
557 and richness of data that can be gathered for water vapor isotope research.

558

## 559 Appendix A



560

561

Figure A1 Sampling duration variation with altitude.

562

## 563 Code availability

564 The diffusion modeling code, which simulates the evolution of water vapor isotopes in the  
565 airbag and corrects them to their initial values, is available at:

566 <https://github.com/DishiWANG0608/Correcting-for-water-vapor-diffusion.git>



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## 567 **Data availability**

568 Data are available from the authors on request.

## 569 **Video supplement**

570 A video showcasing our field campaign on drone-derived water vapor isotope sampling up to  
571 the upper troposphere (11 km) during convective activity, including the workflow for airbag  
572 water vapor isotope sampling, is currently available upon request and will be publicly  
573 accessible in the near future. Please contact the corresponding author for access  
574 (di.wang@lmd.ipsl.fr).

## 575 **Author contributions**

576 D.W., C.R., and L.T. designed the research, established the subjects of the methodology,  
577 and performed the analysis; D.W. and D.Y. conducted the observations; J.B., S.T., H.P. and L.L.  
578 contributed to the establishment of methodologies, data calibration, and analysis; Y.S. provided  
579 assistance with the computing; All authors contributed to the discussion of the results and the  
580 final article; D.W. drafted the manuscript with contributions from all co-authors.

## 581 **Competing interests**

582 The contact author has declared that none of the authors has any competing interests.

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