



The natural abundance of stable water isotopes method may overestimate deep-layer soil water use by trees

Shaofei Wang^a, Xiaodong Gao^{b,c,*}, Min Yang^a, Gaopeng Huo^a, Xiaolin Song^d, Kadambot H. M. Siddique^e, Pute Wu^{b,c}, Xining Zhao^{b,c}

5 ^aKey Laboratory of Agricultural Soil and Water Engineering in Arid and Semiarid Areas, Ministry of Education, Northwest A&F University, 712100, Yangling, Shaanxi Province, China

^bInstitute of Soil and Water Conservation, Northwest A&F University, 712100, Yangling, Shaanxi Province, China

^cInstitute of Soil and Water Conservation, Chinese Academy of Sciences and Ministry of Water Resources, 712100, Yangling, Shaanxi Province, China

10 ^dState Key Laboratory of Crop Stress Biology for Arid Areas, College of Horticulture, Northwest A&F University, Yangling, Shaanxi 712100, China

^eThe UWA Institute of Agriculture, The University of Western Australia, Perth, WA 6001, Australia

Correspondence to: Xiaodong Gao (gao_xiaodong@nwfau.edu.cn)

15 **Abstract.** Stable water isotopes have been used extensively to study the water use strategy of plants in various ecosystems. In deep vadose zone (DVZ) regions, the rooting depth of trees can reach several meters to tens of meters. However, the existence of roots in deep soils does not necessarily mean the occurrence of root water uptake, which usually occurs at a particular time during the growing season. Therefore, quantifying the contribution of deep-layer soil water (DLSW) in DVZ regions using the natural abundance of stable water isotopes may not be accurate because this method assumes that trees
20 always extract shallow- and deep-layer soil water. We propose a multi-step method for addressing this issue. First, isotopic labeling in deep layers identifies whether trees absorb DLSW and determines the soil layer depths from which trees derive their water source. Next, calculate water sources based on the natural abundance of stable isotopes to quantify the water use strategy of trees. We also compared the results with the natural abundance of stable water isotopes method. The 11- and 17-
25 year-old apple trees were taken as examples for analyses on China's Loess Plateau. Isotopic labeling showed that the water uptake depth of 11-year-old apple trees reached 300 cm in the blossom and young fruit (BYF) stage and only 100 cm in the fruit swelling (FSW) stage, whereas 17-year-old trees always consumed water from the 0–320 cm soil layer. Overall, apple trees absorbed the most water from deep soils (>140 cm) during the BYF stage, and 17-year-old trees consumed more water in these layers than 11-year-old trees throughout the growing season. In addition, the natural abundance of stable water isotopes method overestimated the contribution of DLSW, especially in the 320–500 cm soil layer. Our findings highlight
30 that determining the occurrence of root water uptake in deep soils helps quantify the water use strategy of trees in DVZ regions.



1 Introduction

In the past three decades, water availability for vegetation growth has declined (Jiao et al., 2021), and the response of plants to their water environment has received increasing attention (Eggemeyer et al., 2009; Nehemy et al., 2021; Wu et al., 2021).
35 Drought intensity and frequency are expected to increase with climate change (Huang et al., 2017; McDowell et al., 2016), which will likely affect soil water availability and exacerbate changes in vegetation dynamics (Potts et al., 2006). In deep vadose zone (DVZ) regions, trees generally develop deep roots that can access deep-layer soil water (DLSW), facilitating transpiration, potentially buffering against drought stress and contributing to C sequestration in deep soils (Ding et al., 2021; Fan et al., 2017; Germon et al., 2020; Nardini et al., 2016; O'Connor et al., 2021; Wang et al., 2022). Although the important
40 role of DLSW is well-established, few studies have quantified the contribution of DLSW to plant transpiration, limiting our insight into how plants adapt to volatile water environments.

Stable isotope (δD and $\delta^{18}O$) techniques are powerful, reliable, and nondestructive approaches for identifying plant water use strategies (Dawson et al., 2002; Rothfuss and Javaux, 2017). In general, the isotopic composition of hydrogen and oxygen
45 does not change during root water uptake (Ehleringer and Dawson, 1992; Evaristo et al., 2015). Therefore, the isotopic comparison of xylem water and various water bodies (e.g., soil water from different depths, underground water) could reveal the main water sources of plants when significant differences in δD and $\delta^{18}O$ occur between different water bodies (Ding et al., 2021; Yang et al., 2015; Zhao and Wang, 2021). Plant water use strategies in various ecosystems have been extensively researched using natural stable water isotopic techniques (Beyer et al., 2016; Dawson and Ehleringer, 1991; Jiang et al.,
50 2020; Miguez-Macho and Fan, 2021). However, it has been challenging to quantify where in the soil profile the roots extract water due to limitations in monitoring technologies and confusion of physical processes such as preferential flow (Xiang et al., 2019; Zarebanadkouki et al., 2013). Furthermore, most studies using the natural abundance of stable isotopes usually assumed the utilization of soil water at specific depths based on vertical root distribution (Huo et al., 2018; Tao et al., 2021b; Wu et al., 2022; Zhao et al., 2020), which may incorrectly quantify the contribution of different water sources, especially for
55 DLSW.

Several recent studies have demonstrated that the presence of roots in the soil profile does not necessarily reflect where plants are absorbing water (Ehleringer and Dawson, 1992; Kulmatiski et al., 2010; Szutu and Papuga, 2019), particularly in deep soils. For example, Wang et al. (2020b) stated that the heavy absorption of deep soil water only occurred during the
60 BYF stage in apple orchards, while little to no uptake occurred during other stages. Therefore, understanding plant water use strategies should priorly determine the soil layer depths from which trees derive their water source. Surprisingly, few studies have determined where in the soil profile plants absorb water and how it varies during the growing season to quantify plant water use accurately. The isotopic labeling method could increase the isotopic abundance of deep soil water, providing direct evidence of plants' root water uptake (Beyer et al., 2018). Huo et al. (2020) investigated the water use strategy of



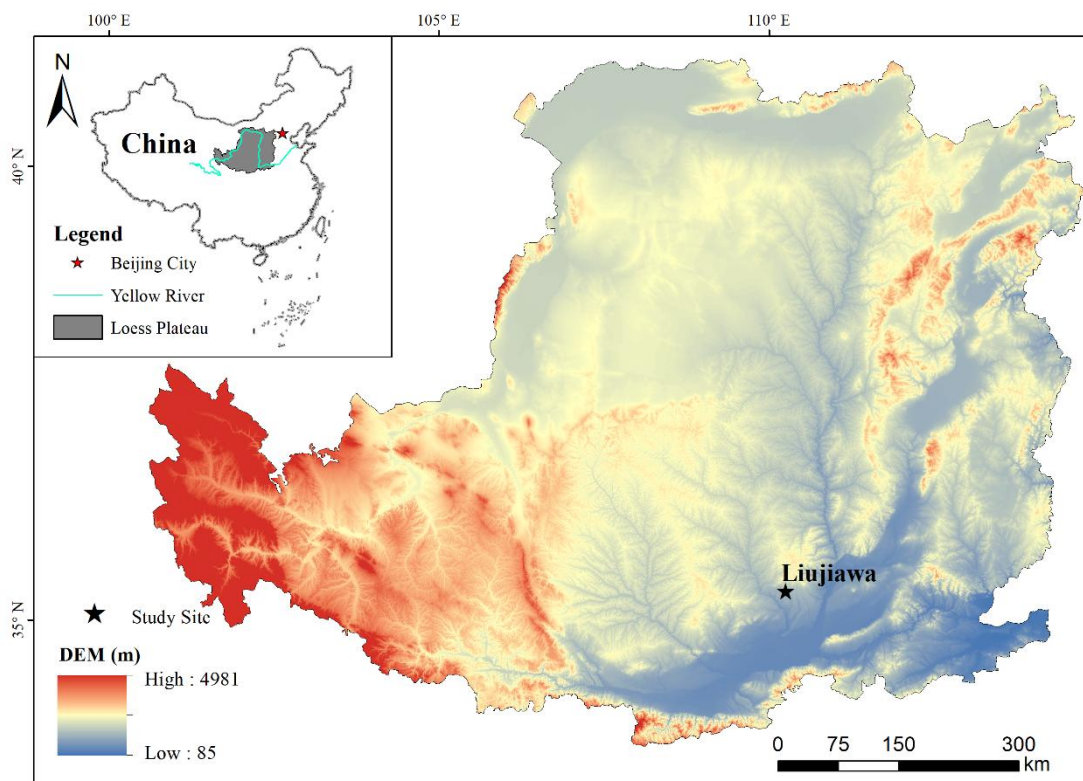
65 agroforestry systems using natural isotopic signatures and isotopic labeling; however, the soil layer depths from which trees
derived water (0–120 cm) was based on the distribution of intercrop roots rather than tree root water uptake. Isotopic
labeling detected a pronounced uptake of soil water at 200 cm depth, suggesting an underestimation of the contribution of
deep soil water to trees. Therefore, it might offer more reliable insights into the water use strategy of trees in DVZ regions by
70 then calculating water sources based on the natural abundance of stable isotopes. In addition, root distribution and water use
strategy often vary depending on stand age (Li et al., 2019; Wang et al., 2021a). More detailed information on root water
uptake are required to elucidate stand age and growing season effect on ecohydrological processes for sustainable vegetation
development in DVZ regions.

75 China's Loess Plateau is a typical dryland ecosystem with DVZ, severe drought and water shortages occur (Fu et al., 2017).
Most vegetation in this region grows under rainfed conditions and develops deep root systems (Wang et al., 2022; Wang et
al., 2015; Yang et al., 2022). On the Plateau, apple trees are the dominant economic plantations, accounting for more than
one-quarter of global coverage and production (Gao et al., 2021b). Over recent decades, the cultivated area of apple trees
increased continuously, with the apple industry becoming the backbone of the local rural economy (Wang and Wang, 2017).
80 However, severe drought and water shortages and intense seasonal precipitation variation have resulted in a complicated and
volatile soil water environment in this region, hampering the sustainability of apple trees. Therefore, this study aimed to (a)
identify the dynamics of DLSW absorption for apple trees, (b) exploit the water use strategy response of apple trees to
variation in the growing season and stand age, and (c) elucidate the difference between the combined method and the natural
abundance of stable water isotopes method.

85 **2 Materials and Methods**

2.1 Study area and experimental site

The study was conducted in 2019 in Chengcheng county, Shaanxi Province, China, in the temperature continental monsoon
climate zone. Mean annual precipitation in the study region is 507.9 mm, and the annual average temperature is 12.6 °C
(1999–2018). The land surface is covered by a thick layer of loess. Apple (*Malus pumila* Mill.) orchards of two stand ages
90 (11- and 17-year-old) were selected (Fig. 1) to collect soil and xylem samples. The orchards are located in the same small
watershed, with similar slopes, aspects, and soil texture, and subjected to the same management regimes (e.g., no irrigation,
standard clipping and fertilization). The sampling locations, height, trunk diameter at 80 cm height, and crown dimensions
(long and short axes) of trees were recorded. General information on the apple orchards is in Table 1.



95

Figure 1: Location of sampling site on the Loess Plateau of China

Table 1. General information on the two apple orchards.

Stand age	Longitude	Latitude	Altitude	Height	Trunk	Crown
/a			/m	/cm	diameter*/cm	size/cm
11	109°50'13"	35°20'5"	863.8	355	12.0	405×352
17	109°50'18"	35°19'58"	862.9	395	14.4	450×380

*Trunk diameter measured at 80 cm height.

2.2 Isotopic data collection

A method combining isotopic labeling and the natural abundance of stable isotopes was used to investigate the water use strategy of apple trees. Firstly, isotopic labeling in deep layers was used to identify whether trees absorb DLSW and determine the soil layer depths from which trees derive their water source. Next, we used the natural abundance of stable isotopes method to quantify the water use strategy of trees. Plant and soil samples in two experiments were collected at three developmental stages in 2019: blossom and young fruit (BYF, May), fruit swelling (FSW, July), and fruit maturation (FTM, September).

105 2.2.1. Isotope labeling experiments



Twelve trees with similar growth in each orchard were randomly selected for labeling at different soil depths (1 m, 2 m, 3 m, 4 m). Day 1 before D₂O injection (May 1, July 9, September 3, 2019), four holes were drilled in quartering radiation from each trunk (0°, 90°, 180°, 270°) at 50 cm radial distance. A long polyvinyl chloride pipe was inserted into the holes at the target depth before injecting 300 mL tracer solution (30 mL 99.99% D₂O plus 270 mL tap water) into each hole. Huo et al. (2020) demonstrated that the change in soil water content (SWC) caused by 300 mL water is less than 1% on the Loess Plateau, and has a negligible impact on soil water balance. After tracer injection, the polyvinyl chloride pipe was removed, and the hole was sealed. Xylem samples from labeling trees were collected on days 1, 3, 5, and 7 after injection, and corresponding samples were collected from unlabeled trees before injection to obtain background isotope concentrations. If the D concentration of the xylem sample was at least two standard deviations (SD) higher than the background value, the tracer was assumed to be present (Kulmatiski et al., 2010).

2.2.2. Sampling natural stable water isotopes

At each sampling event, three trees in each orchard were selected randomly. For xylem samples, three suberized twigs (0.5–1 cm in diameter) were cut from the sunny side of trees, and the bark, phloem, and cambium were removed. Each twig was cut into 1 cm segments and immediately placed in a 15 mL glass vial. The vial was sealed with parafilm, and placed in a box containing ice packs to prevent evaporation. After xylem sampling, soil samples were collected with a hand auger from 0–500 cm soil profile (at 10, 20, and 40 cm intervals from the 0–20, 20–160, and 160–500 cm layers, respectively). One part of each soil sample was placed in a 100 mL vial and stored as per the xylem samples for isotopic determination, while the other was placed in an aluminum box to determine gravimetric SWC by oven-drying.

2.3 Root data collection

In FTM stage, a hand auger with 60 mm internal diameter was used to collect root samples (50 cm from the tree trunk) and three trees in each orchard were selected randomly for sampling. The samples were collected down to 500 cm in 20 cm increments. The samples with roots were washed carefully with tap water in a sieve (0.2 mm) to remove all the soil. The root samples obtained were scanned using a scanner at 300 dpi, and then the fine root length was determined using WinRhizo software (version 5.0 Regent Instruments Inc., Quebec, Canada). The fine root length density (FRLD) in each sample was calculated by dividing the length of fine roots by the volume of the sample.

2.4 Isotopic analysis

The water in xylem and soil samples was extracted using a Li-2000 cryogenic vacuum distillation system (Los Gatos Research, Mountain View, USA). The stable hydrogen and oxygen isotope compositions of extracted soil water and xylem water were determined using a TIWA-45EP isotope ratio infrared spectroscopy analyzer (Los Gatos Research, Mountain View, USA) and Stable Isotope Ratio Mass Spectrometer (Isoprime Limited, UK), respectively.



2.5 Determination of plant water sources

The Bayesian isotope mixing model, MixSIAR (version 3.1.7) package in R was used to calculate the contributions of soil water from different layers to xylem water (Stock and Semmens, 2013). Based on the distributions of soil water isotopic values and the results of labeling experiments, the 0–320 cm soil profile was divided into four water sources (0–40 cm, 40–140 cm, 140–240 cm, and 240–320 cm layers). Both SWC and isotopic values varied the most in the shallow soil layer (0–40 cm) and were most stable in the deep soil layer (140–320 cm). The mean δD and $\delta^{18}O$ values and their standard deviations for each potential water source and the xylem water were used as source and mixture data, respectively, for the model. The fractionation factor was set to zero, assuming no isotope fractionation during root water uptake.

2.6 Statistics

Eq. (1) was used to assess the sensitivity of root water uptake to water source change in natural stable isotopic experiments.

$$S = \frac{CSW_{n+1} - CSW_n}{SWC_{n+1} - SWC_n} \quad (1)$$

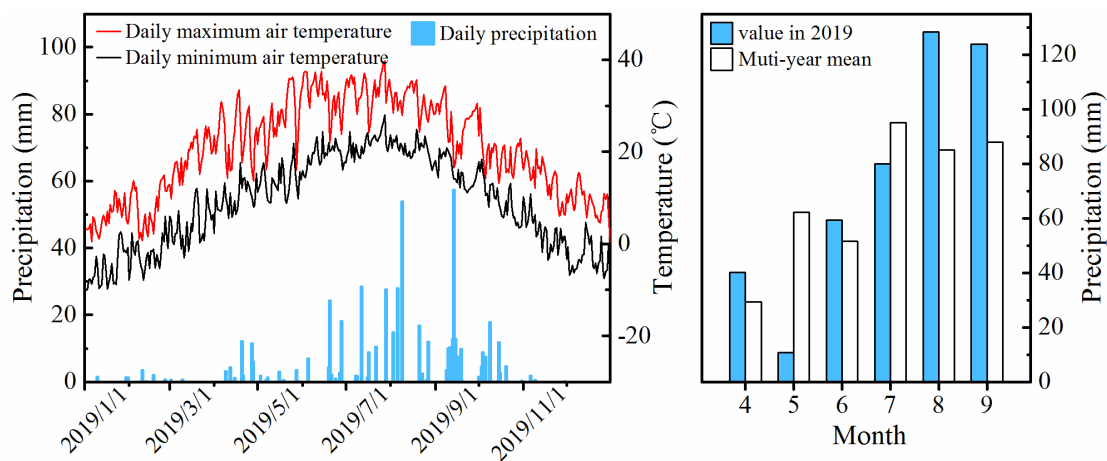
where S is sensitivity, CSW is the contribution of soil water to xylem water, SWC is soil water content, and n is sampling count.

A one-way analysis of variance was used to determine differences in SWC , δD values, and the contribution of water sources among sampling events. The least significant difference was used to perform post-hoc analysis, with significance evaluated at the 0.05 level ($P < 0.05$). All of the above statistical analyses were carried out in SPSS 23.0, with all figures drawn using Origin 2016.

3 Results

3.1 Precipitation and temperature distribution

Figure 2 shows the total precipitation (P_t) and growing season (April to September) precipitation (P_g). P_t and P_g in 2019 were 522.1 mm and 442.3 mm, respectively, similar to the mean annual P_t (507.9 mm) and P_g (407.5 mm). Thus, 2019 was considered a normal precipitation year. Additionally, the highest monthly precipitation and highest single precipitation event occurred in August and September, being 128.3 mm and 57.3 mm, respectively. The seasonal variation in precipitation was significant.



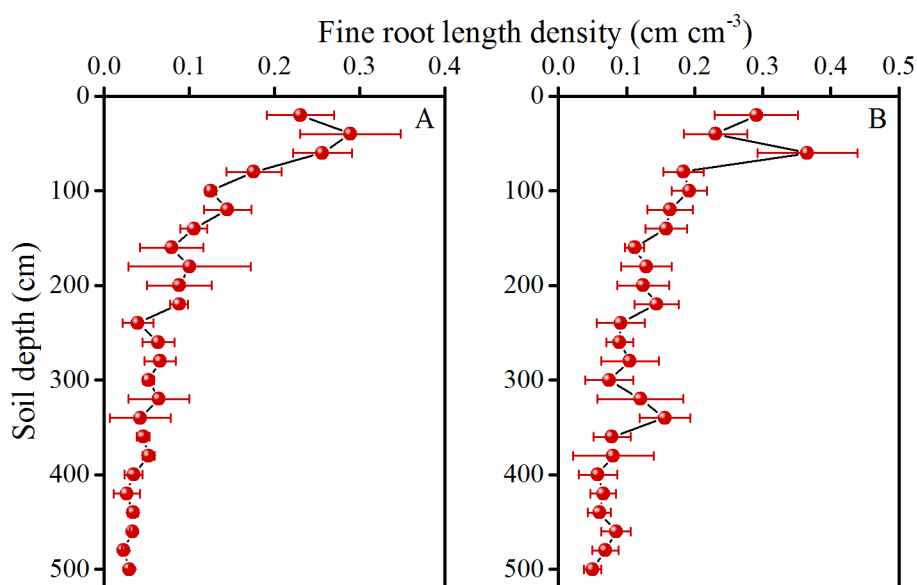
160

Figure 2: Time series of meteorological data in 2019 and monthly precipitation in 2019 and multi-year mean, respectively.

3.2 Root distribution and soil water content

Apple trees had dimorphic rooting systems, with fine roots distributed in shallow and deep soil layers (Fig. 3). The 11- and 17-year old apple trees had similar root distribution profiles, with FRLD decreasing with increasing soil depth and the maximum FRLD occurring at 40 cm and 60 cm depth, respectively. Overall, 17-year-old apple trees had more fine roots in the whole profile than 11-year-old trees. Similarly, the SWC values of the two apple orchards had similar temporal and spatial variations in the profile (Fig. 4). The SWC was highly variable in the 0–100 cm soil layer during the sampling period due to rainfall infiltration, soil evaporation, and root water uptake but was relatively stable in the 240–500 cm layer. The 17-year-old orchard had greater seasonal variations and lower mean SWC values than the 11-year-old orchard (Fig. S1).

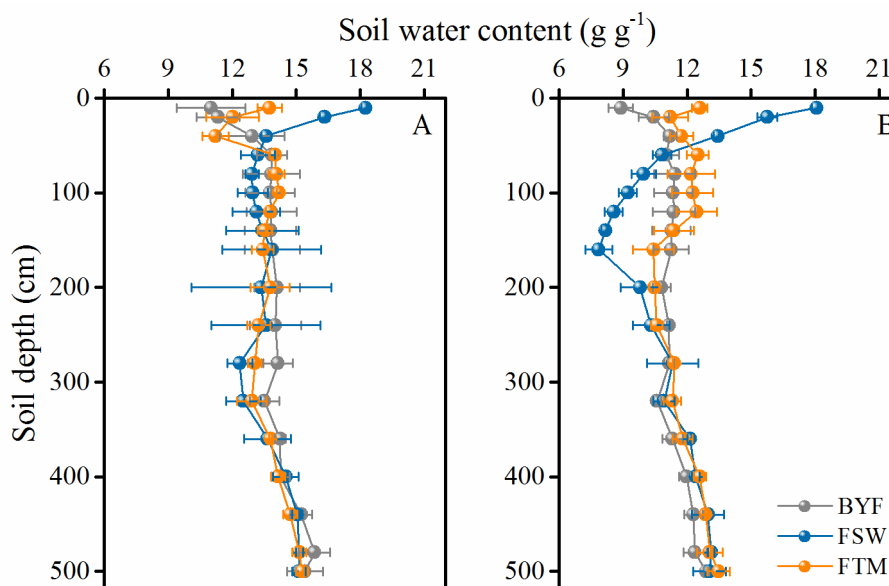
165



170



Figure 3: Vertical distribution of fine root length density (FRLD) in 11-year-old (A) and 17-year-old (B) apple orchards. Values are means \pm SD (N=3).



175 **Figure 4:** Vertical distribution of soil water content (SWC) in 11-year-old (A) and 17-year-old (B) apple orchards. Values are means \pm SD (N=3).

3.3 Absorption dynamics of D₂O tracer

The root water uptake dynamics of apple trees are measured using the dynamics of δD values in xylem water following labeling (Fig. 5). During the BYF stage, no tracer signal was detected at 4 m depth, while pronounced uptake of artificial tracer occurred at 1 m, 2 m, and 3 m depth for both apple orchards. During the FSW stage, tracer signals occurred in both
180 apple orchards. Specifically, the 11- and 17-year-old apple trees absorbed water from the 1 m soil layer quickly, reflected in the markedly elevated δD value for the xylem samples taken one day after D₂O injections. The maximum concentration of D in xylem for both apple orchards occurred on day 3 after labeling, and then decreased rapidly, returning to background values on day 7. Moreover, the presence of artificial D was found in the 17-year-old orchard at 2 m and 3 m labeling depth,
185 with the tracer peak occurring on day 3 after labeling, while none of the sampled trees in the 11-year-old orchard extracted water from soil profiles labeled at 2 m or deeper. During the FTM stage, both orchards had similar tracer uptake patterns to the FSW stage, with the peak δD value in xylem water occurring on day 3 or 5 after labeling.

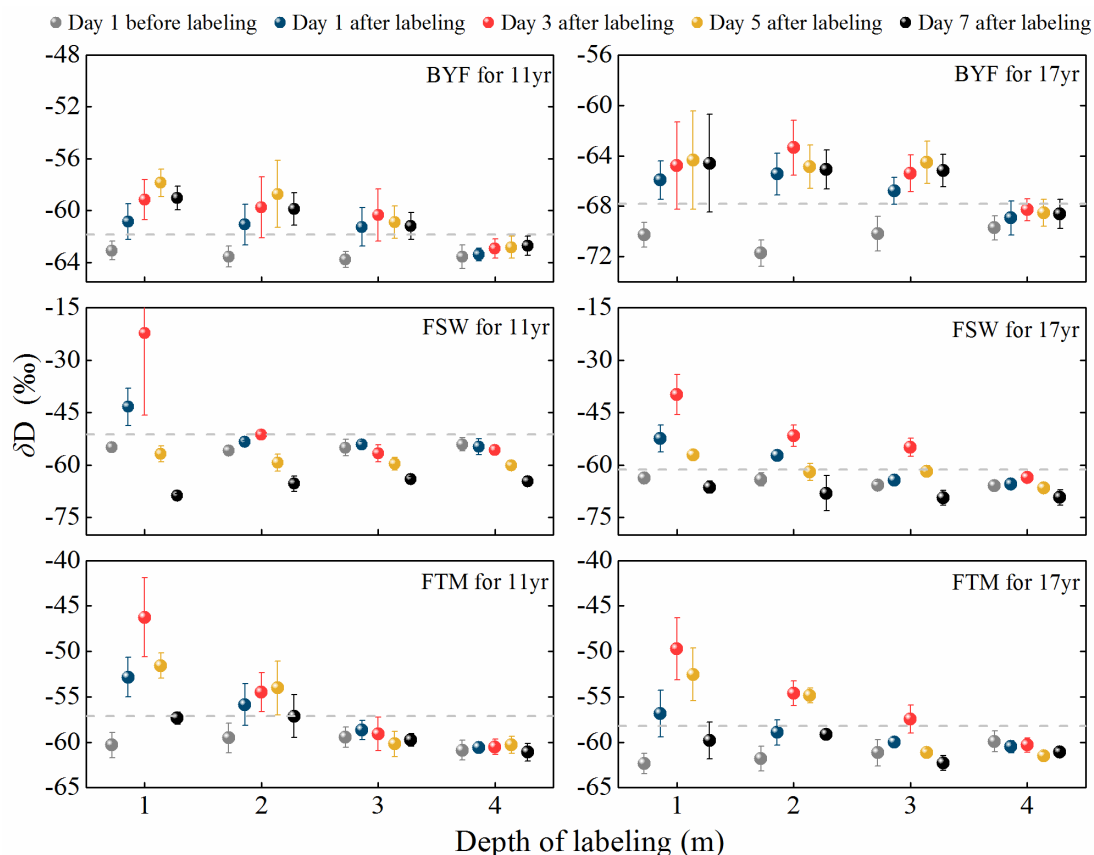


Figure 5: Temporal dynamics of δD values in xylem water for 11- and 17-year-old apple trees. Sample collection started on day 1 before D_2O injection and commenced until day 7. Gray dashed lines represent 2 SD above the background value (mean δD values in xylem water on day 1 before labeling).
 190

3.4 Stable isotopes in xylem and soil water

The δD and $\delta^{18}O$ values in soil water from both apple orchards had similar seasonal and vertical variations (Fig. 6). In general, shallower soils had more enriched isotopic values than deeper soils. The δD and $\delta^{18}O$ values in the 0–40 cm soil layer varied significantly between sampling dates, attributed to the shallow infiltration of rainfall with negative isotopic values and intense surface evaporation. The isotopic values in the 100–500 cm soil layer did not significantly differ between sampling dates ($P > 0.05$).
 195

Isotopic values in xylem water depended on the growing season stage and stand age (Fig. S2). Specifically, the BYF stage had more depleted δD and $\delta^{18}O$ values for 11- and 17-year-old apple trees than the FSW or FTM stage. The similar isotopic values for xylem water in apple trees may result in the same or similar water sources, with different isotopic values signifying different water sources.
 200

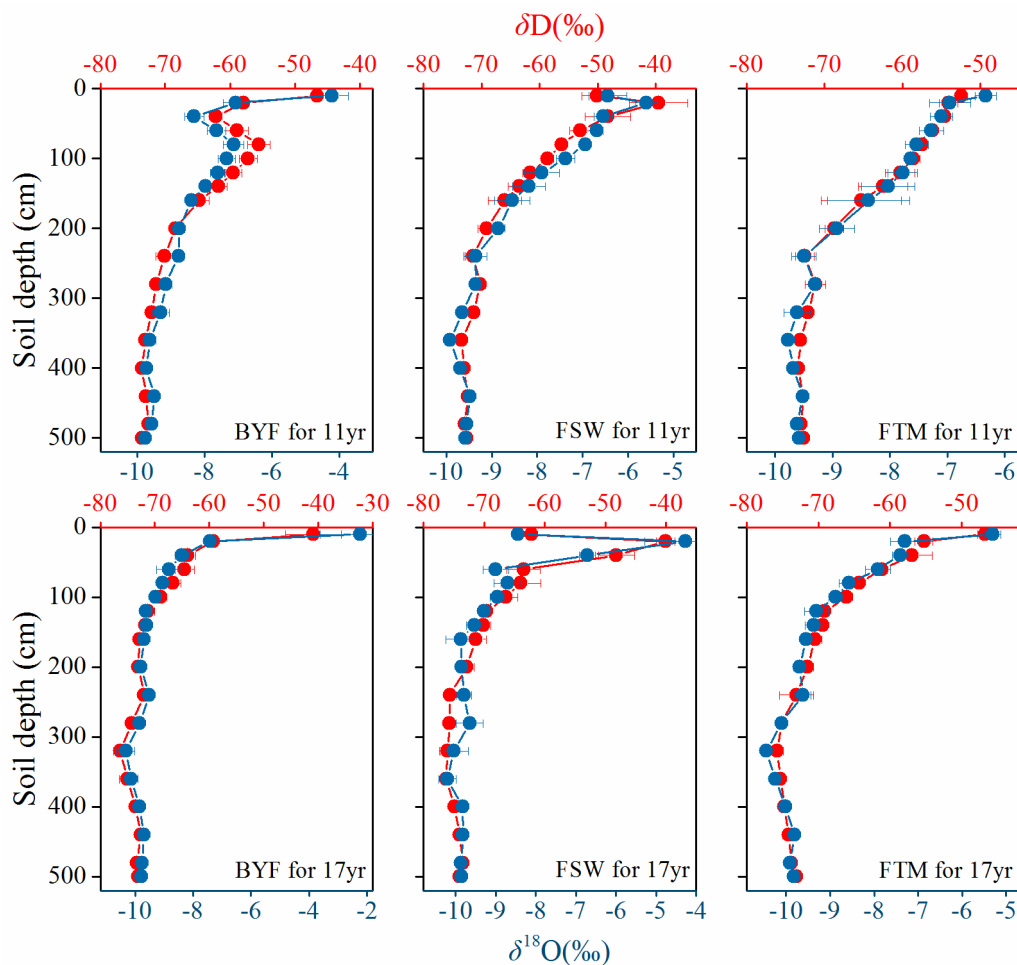


Figure 6: δD and $\delta^{18}O$ values in soil water down the soil profile during the apple growing season in 2019. Values are means \pm SD (N=3).

3.5 Differences between stand age and seasonal variations in water sources

205 The soil layer depths from which apple trees derive their water source during different growing stages were determined using isotopic labeling, before calculating the contribution proportion of different water sources to xylem water using the Bayesian mixed model. As shown in Fig. 7, isotopic values in xylem and soil water followed a similar relationship to the local meteoric water line (LMWL). Across all samples, most of these isotopic values were plotted to the right of LMWL, indicating that soil water in the study area came from precipitation and experienced intense evaporation. The relationship
210 between isotopic values in xylem water and soil water revealed significant variation with growing season stage and stand age, indicating that apple trees could extract water from different soil layers (Figs 7 and 8). Specifically, the BYF stage produced more negative isotopic values in xylem water for 11- and 17-year-old apple trees (Fig. 7), with relatively higher reliance on water in the 140–320 cm soil layer (more than 48%) (Fig. 8). However, as precipitation infiltrated into subsurface layers,



more positive isotopic values in xylem water occurred during the FSW and FTM stages. Especially during the FTM stage, the isotopic values in xylem water were similar to it in the 0–40 cm soil layer (Fig. 7). Results from the mixing model revealed that the contribution of the 0–40 cm soil water during the FTM stage reached 36% and 48% for the 11- and 17-year-old apple trees, respectively (Fig. 8). Overall, older apple trees relied more on deeper soil water during the growing season, ranging from 59% to 29% for 17-year-old apple trees and 48% to 29% for 11-year-old apple trees, respectively (Fig. 8).

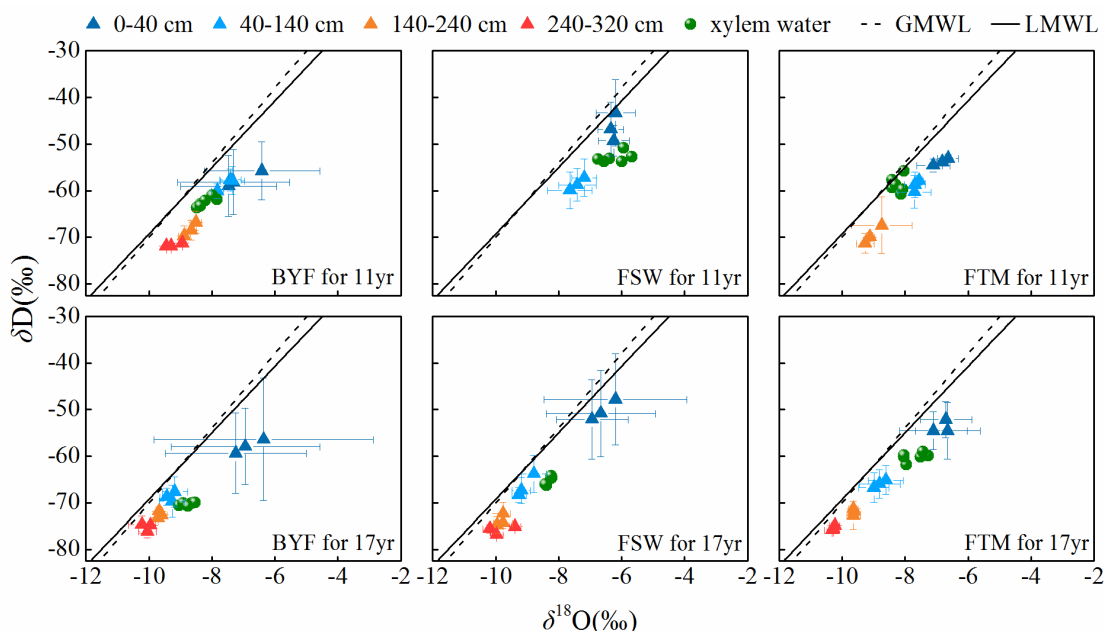


Figure 7: δD and $\delta^{18}O$ values in xylem water and different soil layers (0–40 cm, 40–140 cm, 140–240 cm, 240–320 cm) for 11- and 17-year-old apple trees (\pm SD). The GMWL and LMWL represents the global and local meteoric water lines.

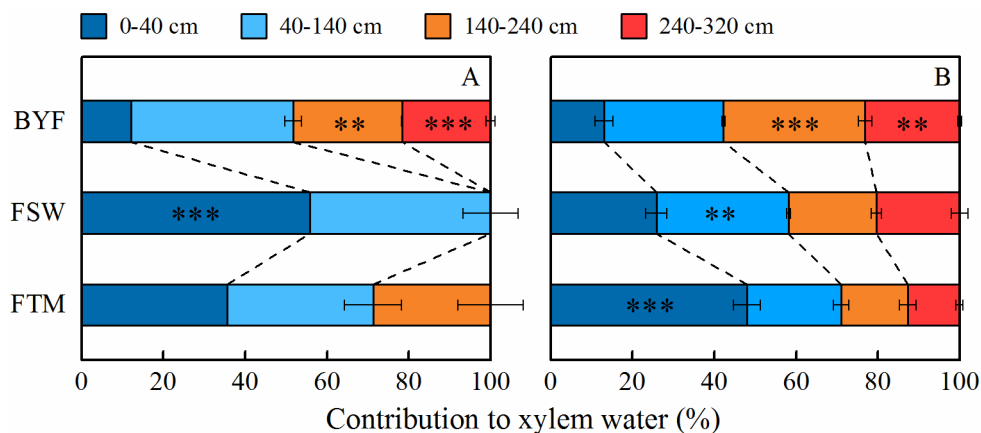
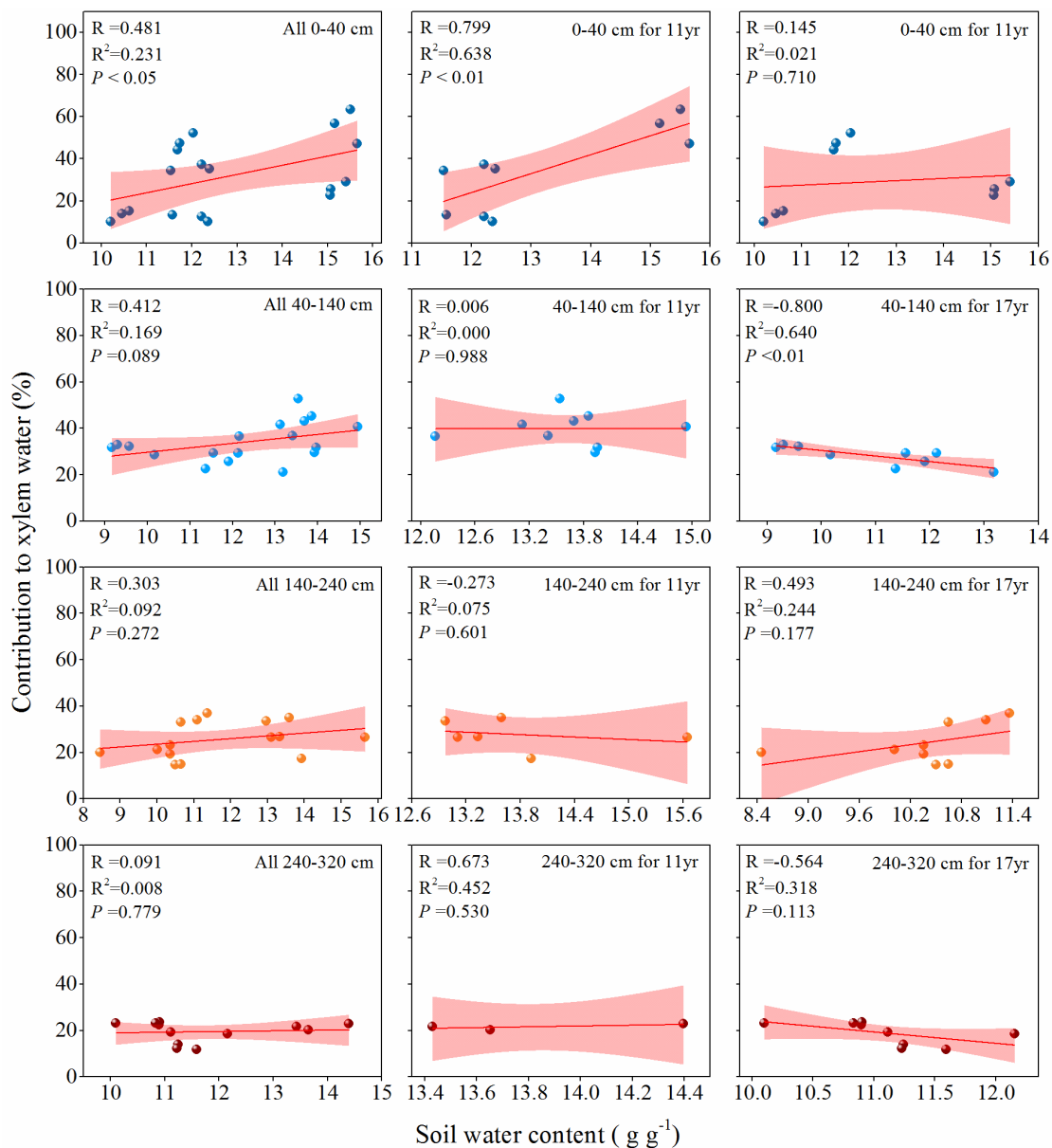


Figure 8: Seasonal patterns of contribution of four potential water sources to xylem water in 11-year-old (A) and 17-year-old (B) apple trees. Error bars indicate standard errors of the means ($N=3$). Asterisks represent significant differences between growing stages (*, $P < 0.05$; **, $P < 0.01$; ***, $P < 0.001$).



3.6 Relationship between the contribution of water sources and corresponding soil water content

230 The relationship between the contribution of water sources and SWC in apple orchards depended on soil depth (Fig. 9). When the data sets for a given soil layer were pooled, a significant ($P < 0.05$) and positive relationship occurred between SWC and its contribution in the 0–40 cm soil layer but not in other soil layers, indicating that apple trees increased the utilization proportion of deeper soil water as SWC decreased in the 0–40 cm soil layer. It is worth noting that the relationship also depended on stand age. Specifically, a significant relationship in the 0–40 cm soil layer occurred in the 11-year-old apple orchard but not in the 17-year-old apple orchard. This relationship did not occur in other soil layers, except the 40–140 cm soil layer in the 17-year-old apple orchard.



235 **Figure 9:** Relationship between the contribution of water sources and soil water content in different soil layers of 11- and 17-year-old apple orchards.



4 Discussion

4.1 Deep soil water uptake dynamics

240 Accurately determining the soil layer depths from which plants derive their water source is essential for quantifying their
water use strategy in DVZ regions. However, it is often difficult to effectively capture changes in this depth caused by
precipitation infiltration, affecting our evaluation of the contribution of different water sources to plant transpiration. In this
study, we artificially injected D₂O tracer to different soil layers to change soil water isotopic composition; then, root water
uptake dynamics in the profile could be acquired by monitoring the concentrations of D in xylem samples, providing direct
245 evidence for accurately determining root water uptake (Couvreur et al., 2020; Menekes et al., 2021).

None of the apple trees in either orchard extracted water from the 4 m labeling depth during the BYF stage, but significant
uptake of artificial tracer occurred at 1 m, 2 m, and 3 m depths (Fig. 5). This indicated that root water uptake in the 0–4 m
soil layer is likely to meet the apple tree's transpiration, despite recent studies showed that the rooting depth of mature apple
250 trees exceeded 5 m (Li et al., 2019; Wang et al., 2021b). We observed a distinctly different absorption of D₂O tracer at
different labeling depths in two orchards during the FSW stage (Fig. 5). At the 1 m labeling depth, an immediate reaction to
D₂O tracer was observed for the 11- and 17-year-old apple trees, in contrast to Evaristo et al. (2019) and Magh et al. (2020),
who reported notable delays (days to weeks) between tracer injection and detection within xylem samples. This could be
ascribed to the relatively tall canopy (>20 m) of their research trees, increasing the time taken for water to travel from roots
255 to crown branches relative to apple trees. Unlike previous studies (Kahmen et al., 2021; Seeger and Weiler, 2021), the peak
tracer concentration occurred on day 3 and then rapid declined until day 7, possibly due to the heavy precipitation event with
more depleted isotope on day 3. At the 2 m and 3 m labeling depths, D₂O tracer was found in the 17-year-old orchard, while
none of the 11-year-old sampled trees extracted water from soil profiles labeled at 2 m and below (Fig. 5). This finding
indicated that the 17-year-old apple trees absorbed more water from deep soils than the 11-year-old trees, consistent with the
260 findings of Wang et al. (2020b). The labeling results during the FTM stage were similar to those at the FSW stage, xylem
water in 11-year-old trees had more enriched isotope at 1 m labeling depth and more depleted isotope at 2 m and below than
that in 17-year-old trees.

4.2 Differences in water sources during the growing season and between stand ages

Numerous evidence from various ecosystems suggests that trees can adjust their water sources to adapt to changes in the
265 surrounding water environment (Barbeta et al., 2015; Gao et al., 2018a; Ma et al., 2021; Zhao et al., 2021). In DVZ regions,
such as the Loess Plateau, soil water from precipitation is the primary water source for plant transpiration (Gao et al., 2021a;
Tao et al., 2021a; Wu et al., 2022). Severe drought and water shortages and intense seasonal precipitation variation result in
complicated and volatile soil water environments in this region. Hence, it is vital that apple trees adapt to this environment to
survive and grow.



270

The contribution proportion of different soil water sources to plant transpiration was calculated using a Bayesian mixed model based on the depth of the tree's root water uptake determined using isotopic labeling. The isotopic signatures in xylem water and soil water depended on growing season stage and stand age, such that seasonal water uptake patterns differed between apple tree growth stage and stand age (Fig. 7). The results from the Bayesian mixing model confirmed this finding (Fig. 8). More specifically, 11- and 17-year-old apple trees exhibited flexible water use strategies, shifting the main water source from deep to shallow soil layers as the growing season progressed (Fig. 8). This is consistent with several recent studies in this region (Huo et al., 2020; Zhao et al., 2020), in which root systems enabled trees to exhibit seasonal water use patterns, switching their water source between soil layers based on available soil water. Notably, SWC of the 0–40 cm soil layer significantly increased in apple orchards due to precipitation recharge in the FSW stage ($P < 0.01$) (Fig. 4), and 11- year-old trees rapidly changed their main water source to shallow soil layer (0–40 cm) (56%) in this stage, while 17-year-old trees changed their main water source to shallow soil layers (48%) until the FTM stage (Fig. 8). One possible explanation is that drought and high temperatures before sampling caused a less reversible embolism, reducing the water conductivity of the shallow root system (Grossiord et al., 2017). This difference indicates that the root water uptake response to soil water change depends on stand age, with 11-year-old trees ($S=12.9$) more sensitive than 17-year-old trees ($S=2.7$) in the 0–40 cm soil layer (Table S1), and verified by the relationship between the contribution of water sources and SWC in the 0–40 cm soil layer (Fig. 9). Similarly, Huo et al. (2018) and Wang et al. (2021a) reported that old trees tended to access stable deep water sources and had a time lag converting water sources following a soil water change. Overall, the apple trees in both orchards absorbed the highest proportion of water in the 140–320 cm soil layer during the BYF stage. Moreover, 17-year-old apple trees had a higher proportion of water from these layers than 11-year-old trees throughout the growing season.

290 4.3 Implications

Plant root water uptake is sensitive to changes in the water environment, and changes in water uptake strategy affect their ecosystem functioning. In DVZ regions, accurately calculating the contribution proportion of different water sources to transpiration helps us understand the variation in plant water use strategies. However, few studies have determined the soil layer depths from which trees derive their water source when calculating the contribution of water sources based on the natural abundance of stable isotopes method. Numerous studies have determined this depth based on prior information (e.g., vertical root distribution) (Tao et al., 2021b; Wu et al., 2022; Zhao et al., 2021), which can reach 5 m to even 10 m. The existence of roots in deep soils does not necessarily mean that root water uptake occurs (Szutu and Papuga, 2019). The isotopic labeling results showed that no water uptake occurred in deep (>140 cm) soils during the FSW stage (Fig. 5). Thus, quantifying the water use strategy of trees in DVZ regions using the natural abundance of stable water isotope method may not be accurate as this method assumes that trees always extract shallow- and DLSW. This study used isotopic labeling in deep layers to identify whether trees absorb DLSW and determine the soil layer depths from which trees derive their water source. Then we calculated water sources based on the natural abundance of stable isotopes method. We also compared the



305 results with the natural abundance of stable water isotopes method (Figs 8 and S3). The results showed that the natural
abundance of stable water isotopes method overestimated the contribution proportion of DLSW (>140 cm) during the BYF
and FSW stages in 11-year-old apple trees (5.0% and 20.1%, respectively). The root water uptake depth from isotopic
labeling indicated that soil water in the 0–140 cm layer replenished by precipitation could meet the transpiration demand of
apple trees during the FSW stage (Figs 5 and 8), improving our understanding of the relationship between the contribution of
water sources and SWC. The contribution proportion of water sources in the 0–40 cm soil layer increased significantly with
SWC in the 11-year-old apple orchard ($P < 0.05$), similar to the findings of previous studies (Gao et al., 2018b; Grossiord et
310 al., 2017). In contrast, no significant differences occurred between the contribution proportions from the 2.4–3.2 m and 2.4–5
m soil layers in the 17-year-old apple orchard (Figs 8 and S3), and trees did not actually acquire water from the 3.2–5 m soil
layer. This further indicated that determining the soil layer depths from which trees derive their water source is important for
understanding the important role of DLSW on plants, especially those with flexible water uptake strategies.

315 The ability of trees to access deep soils is a critical feature for enhancing drought resistance (Nardini et al., 2016; Thorup-
Kristensen et al., 2020; Wang et al., 2020a). Our results show that apple trees switch their water sources between different
soil layers to adapt to the changing water environments on the Loess Plateau, which is particularly important in the context
of future climate change. Special attention should be directed to water consumption in deep soils—we found that apple trees
absorbed the most water from deep soils during the BYF stage, with 17-year-old apple trees consuming more water in these
320 layers than 11-year-old trees throughout the growing season. However, this may not be sustainable. Li et al. (2018) reported
that it takes more than 50 years for soil water migration to 6 m depth using the tritium peak method in apple orchards. Thus,
once DLSW is depleted, it cannot be replenished within a short timeframe, reducing the tree's ability to resist water stress
and threatening the sustainability development of vegetation and changing hydrological cycle in this region. In addition, we
observed the rapid appearance of D signal in xylem following tracer injection, indicating the exchange of bound and mobile
325 water pools in soil and challenging the 'two water world hypothesis'. These findings provide an important reference for
evaluating the validity of hypothesis in semi-arid areas.

5 Conclusions

This study investigated water use strategy of apple trees using a method combining isotopic labeling and the natural
abundance of stable water isotopes and compared the results with the natural abundance of stable water isotopes method. We
330 found that 11- and 17-year-old apple trees had similar water use strategies, switching their main water source from deep to
shallow soils based on the variation in water availability as the growing season progressed. Overall, apple trees absorbed the
most water from deep (>140 cm) soils during the BYF stage, and 17-year-old apple trees consumed more water in these
layers than 11-year-old trees. In addition, the results using the natural abundance of stable water isotopes method clearly
overestimated the contribution of DLSW, especially in 320–500 cm soils. Our findings highlight that determining whether



335 root water uptake occurs in deep soils will help improve the quantification of plant water use strategies in DVZ regions and
provide insights into the effective water management of apple orchards and hydrological cycle in DVZ regions.

Data availability

The data that support the findings of this study are available from the corresponding author upon reasonable request.

Author contributions

340 XG, XZ and PW conceived the study; SW, MY, GH and XS performed field experiments and collected the data; SW
performed the analysis and prepared the first draft of the manuscript; XG and KS edited and commented on the manuscript.

Competing interests

The authors declare that they have no conflict of interest.

Acknowledgements

345 The authors thank Jingjing Jin and Hui Li, Institute of Water-saving Agriculture in Arid Areas of China, Northwest A&F
University, for their technical help. This work was jointly supported by the National Key Research and Development
Program of China (2021YFD1900700), National Natural Science Foundation of China (42125705), Shaanxi Key Research
and Development Program (2020ZDLNY07-04, 2022NY-064), Natural Science Basic Research Program of Shaanxi
(2021JC-19), Cyrus Tang Foundation, Chinese Universities Scientific Fund (2452020242) and the 111 Project (grant no.
350 B12007).

References

- Barbeta, A., Mejia-Chang, M., Ogaya, R., Voltas, J., Dawson, T. E., and Penuelas, J.: The combined effects of a long-term
experimental drought and an extreme drought on the use of plant-water sources in a Mediterranean forest, *Global Change
Biol.*, 21, 1213-1225, 10.1111/gcb.12785, 2015.
- 355 Beyer, M., Hamutoko, J. T., Wanke, H., Gaj, M., and Koeniger, P.: Examination of deep root water uptake using anomalies
of soil water stable isotopes, depth-controlled isotopic labeling and mixing models, *J. Hydrol.*, 566, 122-136,
10.1016/j.jhydrol.2018.08.060, 2018.



- Beyer, M., Koeniger, P., Gaj, M., Hamutoko, J. T., Wanke, H., and Himmelsbach, T.: A deuterium-based labeling technique for the investigation of rooting depths, water uptake dynamics and unsaturated zone water transport in semiarid environments, *J. Hydrol.*, 533, 627-643, 10.1016/j.jhydrol.2015.12.037, 2016.
- Couvreux, V., Rothfuss, Y., Meunier, F., Bariac, T., Biron, P., Durand, J.-L., Richard, P., and Javaux, M.: Disentangling temporal and population variability in plant root water uptake from stable isotopic analysis: when rooting depth matters in labeling studies, *Hydrol. Earth Syst. Sci.*, 24, 3057-3075, 10.5194/hess-24-3057-2020, 2020.
- Dawson, T. E. and Ehleringer, J. R.: Streamside trees that do not use stream water, *Nature*, 350, 335-337, 10.1038/350335a0, 1991.
- Dawson, T. E., Mambelli, S., Plamboeck, A. H., Templer, P. H., and Tu, K. P.: Stable Isotopes in Plant Ecology, *Annu. Rev. Ecol. Syst.*, 33, 507-559, 10.1146/annurev.ecolsys.33.020602.095451, 2002.
- Ding, Y., Nie, Y., Chen, H., Wang, K., and Querejeta, J. I.: Water uptake depth is coordinated with leaf water potential, water-use efficiency and drought vulnerability in karst vegetation, *New Phytol.*, 229, 1339-1353, 10.1111/nph.16971, 2021.
- Eggemeyer, K. D., Awada, T., Harvey, F. E., Wedin, D. A., Zhou, X., and Zanner, C. W.: Seasonal changes in depth of water uptake for encroaching trees *Juniperus virginiana* and *Pinus ponderosa* and two dominant C4 grasses in a semiarid grassland, *Tree Physiol*, 29, 157-169, 10.1093/treephys/tpn019, 2009.
- Ehleringer, J. R. and Dawson, T. E.: WATER-UPTAKE BY PLANTS - PERSPECTIVES FROM STABLE ISOTOPE COMPOSITION, *Plant Cell Environ.*, 15, 1073-1082, 10.1111/j.1365-3040.1992.tb01657.x, 1992.
- Evaristo, J., Jasechko, S., and McDonnell, J. J.: Global separation of plant transpiration from groundwater and streamflow, *Nature*, 525, 91-+, 10.1038/nature14983, 2015.
- Evaristo, J., Kim, M., van Haren, J., Pangle, L. A., Harman, C. J., Troch, P. A., and McDonnell, J. J.: Characterizing the Fluxes and Age Distribution of Soil Water, Plant Water and Deep Percolation in a Model Tropical Ecosystem, *Water Resour. Res.*, 55, 3307-3327, 10.1029/2018wr023265, 2019.
- Fan, Y., Miguez-Macho, G., Jobbagy, E. G., Jackson, R. B., and Otero-Casal, C.: Hydrologic regulation of plant rooting depth, *Proc Natl Acad Sci U S A*, 114, 10572-10577, 10.1073/pnas.1712381114, 2017.
- Fu, B., Wang, S., Liu, Y., Liu, J., Liang, W., and Miao, C.: Hydrogeomorphic Ecosystem Responses to Natural and Anthropogenic Changes in the Loess Plateau of China, *Annu. Rev. Earth Pl. Sc.*, 45, 223-243, 10.1146/annurev-earth-063016-020552, 2017.
- Gao, X., Li, H., and Zhao, X.: Impact of land management practices on water use strategy for a dryland tree plantation and subsequent responses to drought, *Land Degrad. Dev.*, 32, 439-452, 10.1002/ldr.3687, 2021a.
- Gao, X., Liu, Z., Zhao, X., Ling, Q., Huo, G., and Wu, P.: Extreme natural drought enhances interspecific facilitation in semiarid agroforestry systems, *Agric., Ecosyst. Environ.*, 265, 444-453, 10.1016/j.agee.2018.07.001, 2018a.
- Gao, X., Zhao, X., Li, H., Guo, L., Lv, T., and Wu, P.: Exotic shrub species (*Caragana korshinskii*) is more resistant to extreme natural drought than native species (*Artemisia gmelinii*) in a semiarid revegetated ecosystem, *Agr. Forest Meteorol.*, 263, 207-216, 10.1016/j.agrformet.2018.08.029, 2018b.



- Gao, X., Zhao, X., Wu, P., Yang, M., Ye, M., Tian, L., Zou, Y., Wu, Y., Zhang, F., and Siddique, K. H. M.: The economic–environmental trade-off of growing apple trees in the drylands of China: A conceptual framework for sustainable intensification, *J. Clean Prod.*, 296, 126497, <https://doi.org/10.1016/j.jclepro.2021.126497>, 2021b.
- 395 Germon, A., Laclau, J.-P., Robin, A., and Jourdan, C.: Tamm Review: Deep fine roots in forest ecosystems: Why dig deeper?, *For. Ecol. Manage.*, 466, 10.1016/j.foreco.2020.118135, 2020.
- Grossiord, C., Sevanto, S., Dawson, T. E., Adams, H. D., Collins, A. D., Dickman, L. T., Newman, B. D., Stockton, E. A., and McDowell, N. G.: Warming combined with more extreme precipitation regimes modifies the water sources used by trees, *New Phytol.*, 213, 584-596, 10.1111/nph.14192, 2017.
- 400 Huang, J., Yu, H., Dai, A., Wei, Y., and Kang, L.: Drylands face potential threat under 2 degrees C global warming target, *Nat. Clim. Change*, 7, 417-+, 10.1038/nclimate3275, 2017.
- Huo, G., Zhao, X., Gao, X., and Wang, S.: Seasonal effects of intercropping on tree water use strategies in semiarid plantations: Evidence from natural and labelling stable isotopes, *Plant Soil*, 10.1007/s11104-020-04477-5, 2020.
- Huo, G., Zhao, X., Gao, X., Wang, S., and Pan, Y.: Seasonal water use patterns of rainfed jujube trees in stands of different
405 ages under semiarid Plantations in China, *Agric., Ecosyst. Environ.*, 265, 392-401, 10.1016/j.agee.2018.06.028, 2018.
- Jiang, P., Wang, H., Meinzer, F. C., Kou, L., Dai, X., and Fu, X.: Linking reliance on deep soil water to resource economy strategies and abundance among coexisting understorey shrub species in subtropical pine plantations, *New Phytol.*, 225, 222-233, 10.1111/nph.16027, 2020.
- Jiao, W., Wang, L., Smith, W. K., Chang, Q., Wang, H., and D’Odorico, P.: Observed increasing water constraint on
410 vegetation growth over the last three decades, *Nat. Commun.*, 12, 3777, 10.1038/s41467-021-24016-9, 2021.
- Kahmen, A., Buser, T., Hoch, G., Grun, G., and Dietrich, L.: Dynamic 2H irrigation pulse labelling reveals rapid infiltration and mixing of precipitation in the soil and species-specific water uptake depths of trees in a temperate forest, *Ecohydrology*, 14, e2322, <https://doi.org/10.1002/eco.2322>, 2021.
- Kulmatiski, A., Beard, K. H., Verweij, R. J. T., and February, E. C.: A depth-controlled tracer technique measures vertical,
415 horizontal and temporal patterns of water use by trees and grasses in a subtropical savanna, *New Phytol.*, 188, 199-209, <https://doi.org/10.1111/j.1469-8137.2010.03338.x>, 2010.
- Li, H., Si, B., and Li, M.: Rooting depth controls potential groundwater recharge on hillslopes, *J. Hydrol.*, 564, 164-174, 10.1016/j.jhydrol.2018.07.002, 2018.
- Li, H., Si, B., Wu, P., and McDonnell, J. J.: Water mining from the deep critical zone by apple trees growing on loess,
420 *Hydrol. Process.*, 33, 320-327, 10.1002/hyp.13346, 2019.
- Ma, X., Zhu, J., Wang, Y., Yan, W., and Zhao, C.: Variations in water use strategies of sand-binding vegetation along a precipitation gradient in sandy regions, northern China, *J. Hydrol.*, 600, 126539, <https://doi.org/10.1016/j.jhydrol.2021.126539>, 2021.
- Magh, R.-K., Eiferle, C., Burzlaff, T., Dannenmann, M., Rennenberg, H., and Dubbert, M.: Competition for water rather
425 than facilitation in mixed beech-fir forests after drying-wetting cycle, *J. Hydrol.*, 587, 10.1016/j.jhydrol.2020.124944, 2020.



- McDowell, N. G., Williams, A. P., Xu, C., Pockman, W. T., Dickman, L. T., Sevanto, S., Pangle, R., Limousin, J., Plaut, J., Mackay, D. S., Ogee, J., Domec, J. C., Allen, C. D., Fisher, R. A., Jiang, X., Muss, J. D., Breshears, D. D., Rauscher, S. A., and Koven, C.: Multi-scale predictions of massive conifer mortality due to chronic temperature rise, *Nat. Clim. Change*, 6, 295-300, [10.1038/nclimate2873](https://doi.org/10.1038/nclimate2873), 2016.
- 430 Mennekes, D., Rinderer, M., Seeger, S., and Orlowski, N.: Ecohydrological travel times derived from in situ stable water isotope measurements in trees during a semi-controlled pot experiment, *Hydrol. Earth Syst. Sci.*, 25, 4513-4530, [10.5194/hess-25-4513-2021](https://doi.org/10.5194/hess-25-4513-2021), 2021.
- Miguez-Macho, G. and Fan, Y.: Spatiotemporal origin of soil water taken up by vegetation, *Nature*, 598, 624-+, [10.1038/s41586-021-03958-6](https://doi.org/10.1038/s41586-021-03958-6), 2021.
- 435 Nardini, A., Casolo, V., Dal Borgo, A., Savi, T., Stenni, B., Bertoincin, P., Zini, L., and McDowell, N. G.: Rooting depth, water relations and non-structural carbohydrate dynamics in three woody angiosperms differentially affected by an extreme summer drought, *Plant Cell Environ.*, 39, 618-627, [10.1111/pce.12646](https://doi.org/10.1111/pce.12646), 2016.
- Nehemy, M. F., Benettin, P., Asadollahi, M., Pratt, D., Rinaldo, A., and McDonnell, J. J.: Tree water deficit and dynamic source water partitioning, *Hydrol. Process.*, 35, e14004, <https://doi.org/10.1002/hyp.14004>, 2021.
- 440 O'Connor, J. C., Dekker, S. C., Staal, A., Tuinenburg, O. A., Rebel, K. T., and Santos, M. J.: Forests buffer against variations in precipitation, *Global Change Biol.*, 27, 4686-4696, <https://doi.org/10.1111/gcb.15763>, 2021.
- Potts, D. L., Huxman, T. E., Cable, J. M., English, N. B., Ignace, D. D., Eilts, J. A., Mason, M. J., Weltzin, J. F., and Williams, D. G.: Antecedent moisture and seasonal precipitation influence the response of canopy-scale carbon and water exchange to rainfall pulses in a semi-arid grassland, *New Phytol.*, 170, 849-860, <https://doi.org/10.1111/j.1469-8137.2006.01732.x>, 2006.
- 445 Rothfuss, Y. and Javaux, M.: Reviews and syntheses: Isotopic approaches to quantify root water uptake: a review and comparison of methods, *Biogeosciences*, 14, 2199-2224, [10.5194/bg-14-2199-2017](https://doi.org/10.5194/bg-14-2199-2017), 2017.
- Seeger, S. and Weiler, M.: Temporal dynamics of tree xylem water isotopes: in situ monitoring and modeling, *Biogeosciences*, 18, 4603-4627, [10.5194/bg-18-4603-2021](https://doi.org/10.5194/bg-18-4603-2021), 2021.
- 450 Stock, B.C. and Semmens, B.X.: MixSIAR GUI User Manual, version 3.1, <https://conserver.iugocafe.org/user/brice.semmens/MixSIAR>, 2013.
- Szutu, D. J. and Papuga, S. A.: Year-Round Transpiration Dynamics Linked With Deep Soil Moisture in a Warm Desert Shrubland, *Water Resour. Res.*, 55, 5679-5695, <https://doi.org/10.1029/2018WR023990>, 2019.
- Tao, Z., Li, H., and Si, B.: Stand age and precipitation affect deep soil water depletion of economical forest in the loess area, *Agr. Forest Meteorol.*, 310, [10.1016/j.agrformet.2021.108636](https://doi.org/10.1016/j.agrformet.2021.108636), 2021a.
- 455 Tao, Z., Neil, E., and Si, B.: Determining deep root water uptake patterns with tree age in the Chinese loess area, *Agric. Water Manage.*, 249, 106810, <https://doi.org/10.1016/j.agwat.2021.106810>, 2021b.



- Thorup-Kristensen, K., Halberg, N., Nicolaisen, M., Olesen, J. E., Crews, T. E., Hinsinger, P., Kirkegaard, J., Pierret, A., and Dresboll, D. B.: Digging Deeper for Agricultural Resources, the Value of Deep Rooting, *Trends Plant Sci.*, 25, 406-417, 10.1016/j.tplants.2019.12.007, 2020.
- 460 Wang, D. and Wang, L.: Dynamics of evapotranspiration partitioning for apple trees of different ages in a semiarid region of northwest China, *Agric. Water Manage.*, 191, 1-15, 10.1016/j.agwat.2017.05.010, 2017.
- Wang, J., Fu, B., Jiao, L., Lu, N., Li, J., Chen, W., and Wang, L.: Age-related water use characteristics of *Robinia pseudoacacia* on the Loess Plateau, *Agr. Forest Meteorol.*, 301-302, 108344, 10.1016/j.agrformet.2021.108344, 2021a.
- 465 Wang, P., Huang, K., and Hu, S.: Distinct fine-root responses to precipitation changes in herbaceous and woody plants: a meta-analysis, *New Phytol.*, 225, 1491-1499, 10.1111/nph.16266, 2020a.
- Wang, S., An, J., Zhao, X., Gao, X., Wu, P., Huo, G., and Robinson, B. H.: Age- and climate- related water use patterns of apple trees on China's Loess Plateau, *J. Hydrol.*, 582, 124462, 10.1016/j.jhydrol.2019.124462, 2020b.
- 470 Wang, S., Gao, X., Yang, M., Zhang, L., Wang, X., Wu, P., and Zhao, X.: The efficiency of organic C sequestration in deep soils is enhanced by drier climates, *Geoderma*, 415, 115774, <https://doi.org/10.1016/j.geoderma.2022.115774>, 2022.
- Wang, S., Yang, M., Gao, X., Zhang, Z., Wang, X., Zhao, X., and Wu, P.: Comparison of the root-soil water relationship of two typical revegetation species along a precipitation gradient on the Loess Plateau, *Environ. Res. Lett.*, 16, 10.1088/1748-9326/ac00e4, 2021b.
- 475 Wang, Y., Hu, W., Zhu, Y., Shao, M. a., Xiao, S., and Zhang, C.: Vertical distribution and temporal stability of soil water in 21-m profiles under different land uses on the Loess Plateau in China, *J. Hydrol.*, 527, 543-554, 10.1016/j.jhydrol.2015.05.010, 2015.
- Wu, W., Li, H., Feng, H., Si, B., Chen, G., Meng, T., Li, Y., and Siddique, K. H. M.: Precipitation dominates the transpiration of both the economic forest (*Malus pumila*) and ecological forest (*Robinia pseudoacacia*) on the Loess Plateau after about 15 years of water depletion in deep soil, *Agr. Forest Meteorol.*, 297, 108244, <https://doi.org/10.1016/j.agrformet.2020.108244>, 2021.
- 480 Wu, W., Tao, Z., Chen, G., Meng, T., Li, Y., Feng, H., Si, B., Manevski, K., Andersen, M. N., and Siddique, K. H. M.: Phenology determines water use strategies of three economic tree species in the semi-arid Loess Plateau of China, *Agr. Forest Meteorol.*, 312, 108716, <https://doi.org/10.1016/j.agrformet.2021.108716>, 2022.
- 485 Xiang, W., Si, B. C., Biswas, A., and Li, Z.: Quantifying dual recharge mechanisms in deep unsaturated zone of Chinese Loess Plateau using stable isotopes, *Geoderma*, 337, 773-781, 10.1016/j.geoderma.2018.10.006, 2019.
- Yang, B., Wen, X., and Sun, X.: Seasonal variations in depth of water uptake for a subtropical coniferous plantation subjected to drought in an East Asian monsoon region, *Agr. Forest Meteorol.*, 201, 218-228, 10.1016/j.agrformet.2014.11.020, 2015.
- 490 Yang, M., Gao, X., Wang, S., and Zhao, X.: Quantifying the importance of deep root water uptake for apple trees' hydrological and physiological performance in drylands, *J. Hydrol.*, 606, 10.1016/j.jhydrol.2022.127471, 2022.



- Zarebanadkouki, M., Kim, Y. X., and Carminati, A.: Where do roots take up water? Neutron radiography of water flow into the roots of transpiring plants growing in soil, *New Phytol.*, 199, 1034-1044, <https://doi.org/10.1111/nph.12330>, 2013.
- 495 Zhao, Y. and Wang, L.: Insights into the isotopic mismatch between bulk soil water and *Salix matsudana* Koidz trunk water from root water stable isotope measurements, *Hydrol. Earth Syst. Sci.*, 25, 3975-3989, [10.5194/hess-25-3975-2021](https://doi.org/10.5194/hess-25-3975-2021), 2021.
- Zhao, Y., Wang, L., Knighton, J., Evaristo, J., and Wassen, M.: Contrasting adaptive strategies by *Caragana korshinskii* and *Salix psammophila* in a semiarid revegetated ecosystem, *Agr. Forest Meteorol.*, 300, 108323, <https://doi.org/10.1016/j.agrformet.2021.108323>, 2021.
- 500 Zhao, Y., Wang, Y., He, M., Tong, Y., Zhou, J., Guo, X., Liu, J., and Zhang, X.: Transference of *Robinia pseudoacacia* water-use patterns from deep to shallow soil layers during the transition period between the dry and rainy seasons in a water-limited region, *For. Ecol. Manage.*, 457, [10.1016/j.foreco.2019.117727](https://doi.org/10.1016/j.foreco.2019.117727), 2020.