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# Tomato yields and quality declines due to elevated soil CO<sub>2</sub>

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The potential risk for CO $_2$  leakage from carbon capture and storage (CCS) systems has raised significant concerns. While numerous studies have explored how crops respond to elevated soil CO $_2$  levels, relatively few have examined the impacts on vegetables. Tomatoes (Solanum lycopersicum) are a key vegetable crop, and this study sought to investigate how CO $_2$  leakage affects their yield and quality. We conducted pot experiments comparing tomatoes grown under control conditions (no added CO $_2$ ) with those exposed to elevated soil CO $_2$  levels (1500 g m $^{-2}$ d $^{-1}$ ). Our findings indicate that under CO $_2$  leakage conditions, the overall biomass of tomato plants, average fruit weight, and fruit size decreased by 47.42%, 47.65%, and 20.2%, respectively. Notably, the titratable acid content in the tomatoes increased by 27.5%, resulting in a sourer taste. The tomato fruit grades and sugar acid ratio declined leading to a seriously commercial value loss of tomatoes in response to elevated soil CO $_2$  levels. This study provides a more quantitative understanding of how vegetables like tomatoes respond to CO $_2$  leakage, which is crucial for CCS decision-makers to comprehend the adverse effects of CO $_2$  leaks on agriculture.

Keywords Carbon capture and storage, Leakage, Elevated soil CO2, Response of tomato, Quality

Carbon capture and storage (CCS) is an effective technique to achieve significant CO<sub>2</sub> emission reductions by sequestering anthropogenic CO<sub>2</sub> in deep geological formations<sup>1</sup>. Although the likelihood of CO<sub>2</sub> leakage from a CCS system is low<sup>2</sup>, some leakage accidents were reported in Salah, Algeria<sup>3</sup>, and Weyburn-Midale, Canada<sup>4</sup>. It is, therefore, necessary to consider the potential consequences of such leaks by assessing both the ecosystem impact and the environmental risk<sup>5</sup>.

Zero Emission Research and Technology project (ZERT) and Artificial Soil Gassing and Response Detection (ASGARD) have focused on plant responses to CO<sub>2</sub> leakage using artificially controlled CO<sub>2</sub> release from shallow soil<sup>6,7</sup>. The reaction of physiology and morphology of crop plants has been investigated repeatedly under the influence of CO<sub>2</sub> leakage<sup>8</sup>. A significant biomass decrease in the roots and stems occurs when the roots are exposed to very high concentrations of CO<sub>2</sub><sup>9</sup>. The harvested dry matter of teosinte declined by over 70% under 500–2000 g m<sup>-2</sup>d<sup>-1</sup> CO<sub>2</sub> leakage treatments than that of the untreated control<sup>10</sup>. When CO<sub>2</sub> leakage exceeded 500 g m<sup>-2</sup>d<sup>-1</sup>, alfalfa plants showed decreased height and stunted leaf areas. Under a CO<sub>2</sub> leakage rate of 2000 g m<sup>-2</sup>d<sup>-1</sup>, the height of maize plants was only 53.4% of plants observed without CO<sub>2</sub> leakage<sup>11</sup>. Furthermore, exposure to elevated soil CO<sub>2</sub> reduced spring field bean (*Vicia faba L.*) pod and seed numbers by 42% and 46%, respectively, and reduced the seed weight per plant by 36%<sup>12</sup>. Therefore, CO<sub>2</sub> leakage from CCS has been shown to hurt plant growth. However, to date, experiments have mainly focused on crop plants, and only a few studies have investigated the impact of CO<sub>3</sub> leakage on vegetables.

With a rich composition of bioactive compounds, tomatoes (*Solanum lycopersicum*) are one of the most nutritious vegetables consumed worldwide<sup>13</sup>. The global production and plantation areas of tomatoes reached 177 million tons and 5 million hectares in 2016, respectively<sup>14</sup>. Tomatoes are planted in the greenhouse and open fields, with organic and conventional management<sup>15</sup>.  $CO_2$  is the basis for photosynthesis, affecting tomatoes' yield. Under facility agriculture, applying an appropriate amount of  $CO_2$  in the air as fertilizer is essential for obtaining high outcomes and good-quality tomatoes. The net photosynthetic rate of tomato leaves can be significantly increased by exposure to high concentrations of  $CO_2$  during plant growth<sup>16</sup>. With increased atmospheric  $CO_2$  concentration, the number of flowers, fruit layers, and dry matter increased significantly<sup>17,18</sup>. Upon treatment with a  $CO_2$  concentration of  $800 \pm 25 \,\mu$ mol mol<sup>-1</sup>, the soluble sugar content in tomatoes was higher than that in the control group, and the glucose and fructose contents increased significantly by 46% and 42%, respectively<sup>19</sup>. When the indoor  $CO_2$  concentration was increased to  $1000-1200 \,\mu$ L L<sup>-1</sup>, the tomato yield and ascorbic acid were enhanced by 26.48% and 33.27%, respectively<sup>20</sup>. However, all of the above are responses

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of tomatoes to elevated atmospheric CO<sub>2</sub> concentrations; little is known about tomato yield and quality response to the elevated soil CO<sub>2</sub> levels due to CCS leakage.

In this study, tomato plants were tested in a pot experiment to simulate CO<sub>2</sub> leakage from a CCS project. The physical traits of tomatoes, including their biomass, height, fruit weight, and fruit maximum perimeter, were examined. Tomato nutritional qualities were also determined, including soluble sugar, titratable acid, and ascorbic acid content. The main aim was to test the hypothesis that the leaked CO<sub>2</sub> induces a significant decline in tomato yield and quality. This will provide quantitative results to assess the effects of CO<sub>2</sub> leakage on vegetables.

#### Materials and methods

#### Controlled CO<sub>2</sub> release device and soil type

The experiment was conducted using a CO $_2$  leakage control system. The system consisted of a CO $_2$  release device, a pot, and a CO $_2$  detector. CO $_2$  was injected into the soil at the bottom of the pot. The pots (100 cm high  $\times$  50 cm long  $\times$  50 cm wide) were divided into two sections by a gas-permeable separator. The upper Sect. (80 cm) comprised the soil chamber for plant growth (50 cm soil thickness), and the lower Sect. (20 cm) was an air chamber that released CO $_2$  gas. The soil used in the test pots was collected from topsoil in surrounding farmland. The regional soil is mainly tidal cinnamon soil (pH 8.38, organic matter 15.48 g kg $^{-1}$ , total N 0.37 g kg $^{-1}$ , total P 0.61 g kg $^{-1}$ , and total K 20.42 g kg $^{-1}$ ). Before sowing, 75 g of base fertilizer (10 g urea, 50 g calcium superphosphate, and 15 g potassium sulfate including N 4.69 g, P 6 g, and K 7.5 g) was applied to each pot and watered with 15 L of water.

#### Planting and management

The experimental site was at the Shunyi Agro-Environmental Integrated Experimental Base (40° 13′N, 116° 14′E) of the Chinese Academy of Agricultural Sciences. The local area has a temperate continental monsoon climate and is in the transition between semi-arid and semi-humid, temperate, and mid-temperate regions. The annual average temperature, precipitation, and sunshine hours are approximately 11–12 °C, 640 mm, and 2000–2800 h, respectively<sup>21</sup>.

Marwa tomatoes from the Netherlands were used in this experiment. The tomatoes were plastic-plate dot sowed on June 28, 2020, and seedlings were transplanted in a cultivation box on July 19, 2020. One seedling was grown in each pot for three weeks.

#### CO<sub>2</sub> leakage treatment setting

The  $^{\circ}\text{CO}_2$  injection flux (hereafter, flux) was used to measure CO2 leakage intensity. The flux of natural  $^{\circ}\text{CO}_2$  seepage is  $1000-3000~\text{g m}^{-2}\text{d}^{-1}$ , and the upper limit tolerance threshold for maize is  $2000~\text{g m}^{-2}\text{d}^{-1}$ . Based on this data,  $1500~\text{g m}^{-2}\text{d}^{-1}$  CO $_2$  was selected to inject into the soil chamber of the pots with the tomato plants. The treatments were set up as leakage throughout the growth period (Leakage treatment). In addition, there was also one control, non-leakage treatment (CK treatment). Five replicates were performed for each treatment (Fig. 1). There was a two-meter gap between each treatment to prevent interference between the pots.

In the fourth week after transplanting, the tomato plants had four or five true leaves spread out, and  $\rm CO_2$  began to leak out. The  $\rm CO_2$  released to the WL group began on August 14, 2020, and the tomato harvest on November 21, 2020. The leakage flux was calculated as follows<sup>11</sup>:

$$F = rv/s \tag{1}$$

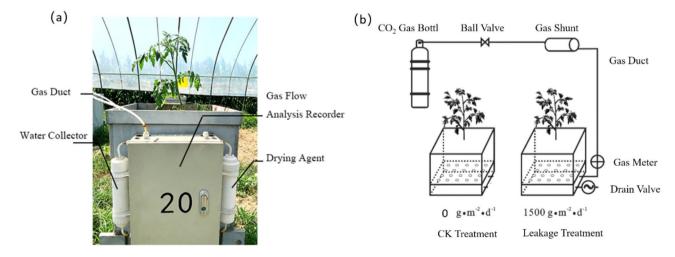


Fig. 1. (a) Photograph and (b) A schematic of the experiment used to evaluate tomato response to  $\rm CO_2$  leakage simulation.  $\rm CO_2$  permeates the soil from the bottom through tiny openings with a diameter of roughly 0.5 cm. CK, no  $\rm CO_2$  injection; Leakage treatment, 1500 g m<sup>-2</sup>d<sup>-1</sup>  $\rm CO_2$  leakage throughout the tomato growth period.

Where F is the CO<sub>2</sub> leakage flux (g m<sup>-2</sup> d<sup>-1</sup>),  $\nu$  is the CO<sub>2</sub> injection rate (mL min<sup>-1</sup>),  $\rho$  is the density of CO<sub>2</sub> under atmospheric pressure (approximately 1.977 g L<sup>-1</sup>), and s is the cross-sectional area of the cultivation box (0.25 m<sup>2</sup>). Hence, the CO<sub>2</sub> injection rate was 132 mL min<sup>-1</sup>.

#### Measurement and analysis

The plant height was recorded weekly. Tomato fruits were harvested on November 21, 2020. The number and weight of harvested fruits were recorded, and the maximum perimeter (n=71 fruit) was measured. After harvest, the roots and stems were pretreated with high-temperature desiccation at 120 °C and dried at 80 °C to a constant weight. The aboveground (except the fruit) and underground biomass were weighed afterward. The response characteristics of tomatoes to  $CO_2$  leakage were evaluated by comparing the differences in biomass, production, and nutritional quality between the leakage treatments.

The tomatoes were freeze-dried and sent to a testing center at the Institute of Agricultural Environment and Sustainable Development (Chinese Academy of Agricultural Sciences) to determine their soluble sugar, titratable acid, and ascorbic acid contents. Soluble sugar content was determined using colorimetry of anthrone-sulfuric acid following the agricultural chemical analysis methods (SSC-39.2.3). Ascorbic acid (vitamin C) content was determined using the 2,6-dichlorophenol indophenol (DCPIP) Association of Official Analytical Collaboration (AOAC) method<sup>22</sup>, and the titratable acid content was determined according to the AOAC method (942.15)<sup>23</sup>.

#### Tomato fruit grading and taste assessment

The tomato fruits harvested will be graded according to the Industry Standards "Grades and specifications of tomatoes (NY/T 940–2006)" and "Tomatoes grading (GH/T 1193–2021)" issued by the Ministry of Agricultural and Rural Affair of People's Republic of China and All-China Federation of Supply and Marketing Cooperative.

The sugar acid ratio refers to the ratio of soluble sugars to titratable acids in fruits, and is one of the essential reference indicators for measuring taste. It is generally believed that the appropriate sugar acid ratio for tomatoes is 6.9–10.8<sup>24</sup>.

$$R = \frac{S_{Soluble}}{A_{Titratable}}$$

Here, R is sugar acid ratio, dimensionless;  $S_{Soluble}$  is soluble sugar, %;  $A_{Titratable}$  is titratable acid, %.

We determined the magnitude of the effect by comparing the means from the leakage and control groups. All experimental data were analyzed using the independent sample t-test in SPSS 19.0, and significance was indicated at  $p \le 0.05$ .

#### Results

#### Tomato biomass and development

We found that increased soil CO $_2$  levels led to a significant decrease in tomato above ground biomass. The aboveground biomass values were  $147.33\pm6.54$  g and  $71.02\pm10.37$  g under CK and leakage treatments, and the biomass of the leakage group decreased by 51.79% compared to the CK treatment (Table 2). However, the groups had no significant difference in the underground biomass (Fig. 2a). The total biomass (including above ground and underground) of the leakage treatments decreased significantly by 47.42% compared to that of CK. As shown in Fig. 2b, the plant height did not differ considerably between CK and leakage groups, with the average plant height of the tomato plants reaching  $95.20\pm4.35$  cm and  $94.00\pm3.27$  cm, respectively (Table 2).

The  $CO_2$  leakage during the whole tomato growth period with a 1500 g m<sup>-2</sup>d<sup>-1</sup>  $CO_2$  injection, and the CK group (control) had no  $CO_2$  injection. The asterisk represents a significant difference between CK and the treatment groups (p < 0.05).

#### Tomato grading

The CK and leakage groups harvested 22 fruits; the average fruit weights were  $124.40\pm15.69$  g and  $71.03\pm8.46$  g, respectively. The maximum perimeter of the tomato fruits reached  $194.36\pm9.76$  mm and  $166.59\pm7.82$  mm under CK and leakage treatments, respectively (Table 2). As shown in Fig. 2c and d, compared to the CK group, the average weight and size of fruit in the leakage group decreased significantly by 42.90% and 14.28%%, respectively. Total tomato fruit weights were 2825.46 g and 1606.22 g under CK and leakage treatments. The largest fruit perimeter of tomato reached  $194.36\pm9.76$  mm and  $166.59\pm7.82$  mm under CK and leakage treatments, respectively (Fig. 2d). The weight and size of tomatoes in the CO $_2$  leakage groups showed a significant decreasing trend compared to the CK group.

According to the tomato fruit grading standards (Table 1), the fruit weight of CK meets the middle grade, and that of leakage treatment drops down to a samll grade. Compared to the CK group, the fruit diameters of leakage treatment declined from  $61.89\pm3.11$  mm to  $53.05\pm2.49$  mm, but both are still classed in small grades (Table 2).

#### Tomato's nutritional quality and taste

Figure 3 shows that the average ascorbic acid and soluble sugar contents of the tomatoes are  $23.76\pm3.66$  mg/100 g,  $3.22\pm0.18\%$  under CK treatments, and  $19.94\pm2.77$  mg/100 g, and  $3.54\pm0.27\%$  under CO $_2$  leakage treatments (Table 3). However, the titratable acid content increased by 29.16% from  $0.48\pm0.02\%$  to  $0.62\pm0.05$  under the 1500 g m $^{-2}$  d $^{-1}$  treatments, which led to the sugar acid ratio decreased sharply. Under the CK treatments, the sugar acid ration of tomato fruits is  $6.71\pm0.51$ , which is near the lower limit of best taste (6.9–10.8). When a 1500 g m $^{-2}$ d $^{-1}$ CO $_2$  leak occurs, the sugar acid ration of tomato falls to  $5.64\pm0.44$ , a decrease of 15.95%.

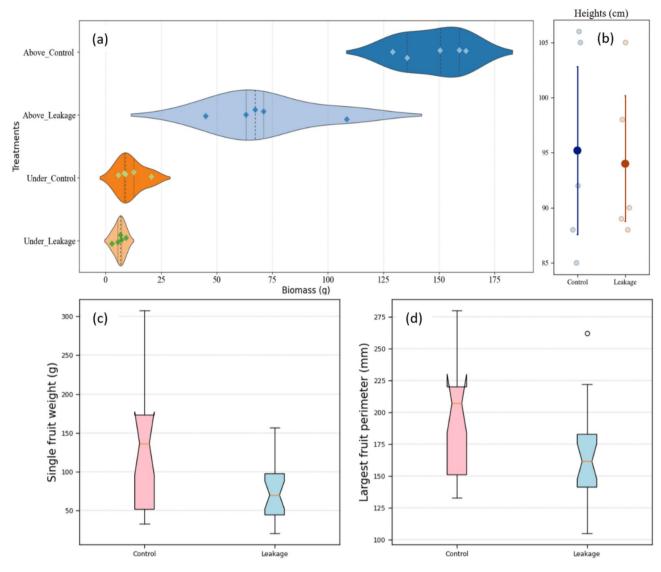


Fig. 2. Biomass, plant height, fruit weights, and perimeters of the tomatoes for the control and leakage treatments ( $\mathrm{CO}_2$  leakage during the tomato growth period). (a) Above- and underground biomass of tomato. The indicators shown are aboveground biomass under control treatment (Above\_Control), aboveground biomass under leakage treatment (Above\_leakage), underground biomass under control treatment (Under\_Control), and underground biomass under leakage treatment (Under\_leakage). The vertical line in each box is the median value, and the box graph is drawn using the quartile method. (b) Tomato plant heights. (c) Weight of a single fruit and (d) the largest fruit perimeter per plant (mm). The horizontal line in each box is the median value, and the box graphs were drawn using the quartile method. CK is the control (no  $\mathrm{CO}_2$  leakage); the leakage group is the experimental group where  $\mathrm{CO}_2$  leakage occurred throughout the growth period, with a leakage amount of 1500 g m $^{-2}\mathrm{d}^{-1}$ . All groups were subjected to the same water and heat conditions.

Tomato fruits	Large (L)	Middle (M)	Small (S)	References
Fruits mass (g)	>150	100-150	< 100	GH/T 1193-2021
Fruits diameter (mm)	>70	50-70	< 50	NY/T 940-2006

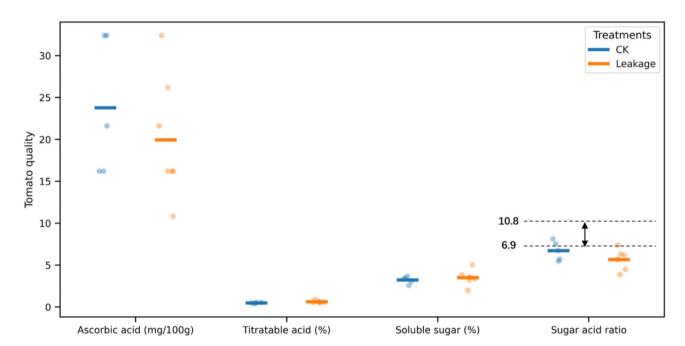
Table 1. Tomato fruit grading standards.

#### Discussion

This study investigated the response of tomato yield and quality caused by elevated soil CO<sub>2</sub> concentration from a pot simulation of leaking CCS project at a rate of 1500 g m $^{-2}$  d $^{-1}$  (Fig. 1). As shown in Fig. 2a; Table 2, elevated soil CO<sub>2</sub> reduced the tomato plant biomass by 47.42%, which is comparable with the results of Zhang et al., who found that maize biomass decreased by 67.9% with a CO<sub>2</sub> leakage concentration of 1500 g m $^{-2}$  d $^{-15}$ .

Variables	CK group	Leakage treatment	t	p-value
Aboveground biomass (%)	147.33 ± 6.45 (N=5)	71.02 ± 10.37 (N=5)	6.242	0.00*
Underground biomass (%)	11.29 ± 2.57 (N=5)	6.30 ± 1.04 (N=5)	1.79	0.11
Plant height (cm)	95.20 ± 4.35 (N=5)	94.00 ± 3.27 (N=5)	0.22	0.83
Fruit weight (g)	124.40 ± 15.69 (N = 22)	71.03 ± 8.46 (N=22)	2.65	0.01*
Fruit perimeter (mm)	194.36 ± 9.76 (N = 22)	166.59 ± 7.82 (N = 22)	2.22	0.03*
Fruit diameter (mm)	61.89 ± 3.11 (N=22)	53.05 ± 2.49 (N = 22)	2.22	0.03*

**Table 2**. T-test results for the variations in the amount of aboveground biomass, underground biomass, plant height, fruit weight, and fruit perimeter among treatment groups (mean  $\pm$  SE).



**Fig. 3.** Ascorbic acid (mg/100 g), soluble sugar (%), titratable acid (%), and sugar acid ratio of the tomatoes for the control and leakage treatments ( $CO_2$  leakage during the tomato growth period). The blue and orange dots represent control and leakage treatments. The dashed line shows the tomatoes' appropriate sugar acid ratio (6.9–10.8).

Variables CK group		Leakage group	t	<i>p</i> -value
Ascorbic acid (mg/100 g)	23.76 ± 3.66 (N=5)	19.94 ± 2.77 (N=7)	0.84	0.41
Titratable acid (%)	$0.48 \pm 0.02 \ (N=5)$	0.62 ± 0.05 (N=7)	- 2.16	0.05*
Soluble sugar (%)	$3.22 \pm 0.18 \ (N=5)$	$3.49 \pm 0.34 \ (N=7)$	- 0.53	0.60
Sugar acid ratio	$6.71 \pm 0.51 \; (N=5)$	5.64 ± 0.44 (N=7)	1.56	0.15

**Table 3**. *T*-test results for the variation in ascorbic acid, titratable acid, and soluble sugar contents among CK and CO<sub>2</sub> leakage treatment groups (labeled treatment) (mean  $\pm$  SE). The CO<sub>2</sub> leakage treatment was treated with a 1500 g m<sup>-2</sup>d<sup>-1</sup> CO<sub>2</sub> injection, and the CK group (control) had no CO<sub>2</sub> injection. The asterisk represents a significant difference between CK and treatment groups (p < 0.05).

The harvested dry matter of teosinte declined by over 70% under 500–2000 g m $^{-2}$ d $^{-1}$  CO $_2$  leakage treatments than that of the untreated control  $^{10}$ . Therefore, scholars have achieved a relatively consistent understanding of the negative impacts of CCS leakage on plant biomass and yields. The biomass response of tomatoes follows this pattern as well. Furthermore, this study introduced the fruit grading standard into the assessment system. According to Table 2, the grades of tomato fruits decreased from moderate to small in the three-level grading system during the single fruit weight and significantly decreased from 124.40  $\pm$  15.69 g to 71.03  $\pm$  8.46 g. This suggests that the impact of CCS leakage on fruit producing vegetables not only needs to consider a significant decrease in vegetable yield, but also causes a decline in fruit grade, further expanding economic losses.

Fruit flavor is an important economic trait for evaluating fruit quality, and it is also one of the essential sensory indicators that determine consumers' choices $^{25}$ . As shown in Fig. 3; Table 3, the titratable acid content significantly increased by 29.16% under the 1500 g m $^{-2}$  d $^{-1}$  treatment, which led to the sugar acid ratio decreasing sharply. Generally, the appropriate sugar acid ratio for tomatoes is 6.9–10.8 $^{24}$ . Under the CK treatments, the sugar acid ratio of tomato fruits is  $6.71\pm0.51$ , which is near the lower limit of best taste (6.9). When a 1500 g m $^{-2}$ d $^{-1}$  CO $_2$  leak occurs, the sugar acid ratio of tomato falls to  $5.64\pm0.44$ , a decrease of 15.95%. It is not difficult to infer that due to the decrease in tomato sugar acid ratio causing poor taste, CCS leakage will lead to a significant decrease in the commercial value of tomatoes.

The elevated soil CO<sub>2</sub> caused by CCS leakage is a rare environmental stress for tomato quality assessment. Compared with other frequently discussed stress, such as salt, drought, and flooding, the taste of tomato under the stress of CCS leakage displayed some consistent characteristics. Li et al. reported that saline water irrigation increased the glucose contents at a mature period by 31.55% compared with freshwater irrigation<sup>26</sup>. Salt stress could increase carbohydrate accumulation by 18.34% in the tomato fruits, while organic acids were 1.71 times that of control. It will decrease the sugar acid ratio of tomatoes<sup>27</sup>. It can be seen that the response of tomatoes to salt stress and soil CO2 increase stress is very similar, ultimately leading to a decrease in tomato sugar acid ratio and a deterioration in taste. However, drought stress also severely affects tomato yield and quality<sup>28</sup>. The mild water deficit could increase the total amount of organic acids and soluble sugar. Water deficit could increase the sugar acid ratio of tomato fruit, with an increase of 8.17%<sup>24</sup>. That is to say, drought may lead to an improvement in tomato taste, which is different from the impact of increased soil CO, stress. The observation of plant height, the number of leaves, leaf area, and relative growth rate were significantly reduced under flooding compared to the control<sup>29</sup>. Feng et al. reported that soil moisture content under waterlogging positively interacts with titratable acid accumulation in tomatoes<sup>30</sup>. Flooding stress may also cause tomato flavors to become sour. It can be seen that tomatoes have significant differences in their response to different types of environmental stress, and the response results of CCS leakage stress enrich our understanding of tomato characteristics.

As shown in Fig. 2b, the plant heights of tomatoes remained unchanged when exposed to 1500 g m $^{-2}$  d $^{-1}$  CO $_2$  leakage. Notably, the plant height of maize, alfalfa, clover, teosinte, and millet decreased under leaked CO $_2$  treatment<sup>8,31,32</sup>. All these experiments suggest that crop height has a consistently negative response to CO $_2$  leakage. Furthermore, the underground biomass of tomato showed no reaction to CO $_2$  leakage, which also differed from previous results, which showed that the root length and root volume of maize were reduced by 44.73% and 19.16, respectively, under 1000 g m $^{-2}$  d $^{-1}$  of CO $_2$  leakage $^{33}$ . This suggests that the tomato morphology is insensitive to elevated soil CO $_2$ , and the main effect of CO $_2$  leakage on tomato plants is on their fruit yield and quality. Tomatoes have strong adaptability to environmental stress $^{34}$ . Detailed monitoring and assessments of tomato plants and other plant responses are necessary to evaluate such differences further.

Compared with previous studies<sup>1</sup>, our results further revealed the response of tomato fruit degradation and taste worse, which will further amplify the economic losses caused by CCS leakage on plants. However, some component gaps that affect the flavor of the tomato (e.g., volatile compounds) in our experiments should be considered in future studies. The yield and quality response characteristics for CCS leakage, while the underlying mechanistic explanation, are still far from being answered. The impact of elevated soil  $\mathrm{CO}_2$  on the biosynthesis pathways of tomato flavor-contributing substances and the changes in the main enzyme activities involved are still unknown.

#### **Conclusions**

This pot experiment demonstrated tomato yield loss and quality degradation caused by elevated soil  $\rm CO_2$  concentration from a pot simulation of failure CCS project. Under  $\rm CO_2$  leakage conditions, the total plant biomass of tomatoes has almost halved. The tomato fruits grades decreased from moderate to small-grade in the three-level grading system, while the single fruit weight and size significantly decreased. More importantly, the sugar acid ratio of tomatoes declined by 15.95%, from near optimal taste to a sourer taste, leading to a seriously reduced commercial value of tomatoes in response to elevated soil  $\rm CO_2$  levels. Our study provides a more quantitative description of the response of tomatoes to  $\rm CO_2$  leakage. This will enable carbon capture and storage (CCS) decision-makers to deepen their understanding of CCS safety and associated risk management.

Our testing focuses on the response and impact assessment of vegetables, especially tomatoes, to CCS leakage. From a more comprehensive perspective, in addition to food crops, sugar crops, oilseeds, feed, and fruits widely planted in the field may be affected by CCS project leaks. Future research will focus on further expanding the scope of evaluating plant types and yield quality indicators.

#### Data availability

All data generated or analyzed during this study are included in this published article.

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Data curation, methodology, and writing-original draft preparation; X.Z; conceptualization, funding acquisition, and writing-review & editing, X.M.

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#### **Declarations**

#### Competing interests

The authors declare no competing interests.

#### Additional information

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