

# Grazing decreases net ecosystem carbon exchange by decreasing shrub and semi-shrub biomass in a desert steppe

xin Ju<sup>1</sup>, Bingying Wang<sup>2</sup>, Xiaojia Zhang<sup>1</sup>, Qian Wu<sup>1</sup>, and Guodong Han<sup>1</sup>

<sup>1</sup>Inner Mongolia Agricultural University

<sup>2</sup> Forest and Grassland Protection and Development Center, Bairin Right Banner

April 25, 2024

## Abstract

Livestock grazing can strongly determine how grasslands function and their role in carbon cycle. However, how ecosystem carbon exchange responds to grazing and the underlying mechanisms remain unclear. We measured ecosystem carbon fluxes to explore the changes in carbon exchange and their driving mechanisms in a 16-year long term experiment with different grazing intensities in a desert steppe grassland. We found that grazing intensity influenced above- and belowground biomass during the peak growing season, primarily by decreasing shrubs and semi-shrubs and perennial forbs. Furthermore, alter patterns of net ecosystem exchange primarily via their negative influence on the biomass of shrub and semi-shrub. In addition, grazing-induced reduction belowground biomass, as well as in total plant nitrogen and soil ammonium nitrogen, can strongly influence ecosystem carbon exchange and soil respiration. When nitrogen is lost from the soil due to grazing, plants reallocate resources belowground to maintain growth and development, thus promoting photosynthesis and respiration. Our study indicates that soil available nitrogen and shrubs and semi-shrubs are important factors in regulating ecosystem carbon exchange under grazing disturbance in the desert steppe, which provide a basis for grazing management.

**Running title:** Grazing effects on ecosystem carbon exchange

**Grazing decreases net ecosystem carbon exchange by decreasing shrub and semi-shrub biomass in a desert steppe**

*Xin Ju<sup>1</sup>, Bing-ying Wang<sup>2</sup>, Xiao-jia Zhang<sup>1</sup>, Qian Wu<sup>1,\*</sup>, Guo-dong Han<sup>1,\*</sup>*

<sup>1</sup> *Key Laboratory of Grassland Resources of the Ministry of Education, Key Laboratory of Forage Cultivation, Processing and High Efficient Utilization of the Ministry of Agriculture and Rural Affairs, Inner Mongolia Key Laboratory of Grassland Management and Utilization, College of Grassland, Resources and Environment, Inner Mongolia Agricultural University, Hohhot 010011, Inner Mongolia, China.*

<sup>2</sup> *Forest and Grassland Protection and Development Center, Bairin Right Banner 025150, Inner Mongolia, China.*

\* Correspondence: Guo-dong Han

E-mail: [hanguodong@imau.edu.cn](mailto:hanguodong@imau.edu.cn)

Tel & Fax: + 86 13087122590

Qian Wu

E-mail: [qianwu@imau.edu.cn](mailto:qianwu@imau.edu.cn)

Tel & Fax: + 86 13848140272

## Abstract

Livestock grazing can strongly determine how grasslands function and their role in carbon cycle. However, how ecosystem carbon exchange responds to grazing and the underlying mechanisms remain unclear. We measured ecosystem carbon fluxes to explore the changes in carbon exchange and their driving mechanisms in a 16-year long term experiment with different grazing intensities in a desert steppe grassland. We found that grazing intensity influenced above- and belowground biomass during the peak growing season, primarily by decreasing shrubs and semi-shrubs and perennial forbs. Furthermore, alter patterns of net ecosystem exchange primarily via their negative influence on the biomass of shrub and semi-shrub. In addition, grazing-induced reduction belowground biomass, as well as in total plant nitrogen and soil ammonium nitrogen, can strongly influence ecosystem carbon exchange and soil respiration. When nitrogen is lost from the soil due to grazing, plants reallocate resources belowground to maintain growth and development, thus promoting photosynthesis and respiration. Our study indicates that soil available nitrogen and shrubs and semi-shrubs are important factors in regulating ecosystem carbon exchange under grazing disturbance in the desert steppe, which provide a basis for grazing management.

*Keywords* Grazing intensity, Net ecosystem carbon exchange, Ecosystem respiration, Soil respiration, *Stipa breviflora* desert steppe

## Introduction

Grassland ecosystems cover a large proportion of the arid and semi-arid regions of the world, playing an important role in the global carbon cycle (Scurlock and Hall 1998; Schuman *et al.* 2002; Zhou *et al.* 2019; Lei *et al.* 2020). The degree to which terrestrial ecosystems serve as net carbon sinks or sources depends on the balance between the carbon fixed by plant photosynthesis and the carbon released into the atmosphere by plant and soil respiration (Peng *et al.* 2014; Li *et al.* 2017b; Jin *et al.* 2023). While numerous evidence has addressed the degree to which forested systems serve as net carbon sinks or sources (Martens *et al.* 2004; Rebane *et al.* 2020), the status of grassland ecosystems as sources or sinks can be highly variable (Dai *et al.* 2014; Smith 2014; Chang *et al.* 2021). Grasslands can be an important carbon sink in some places or times (Hafner *et al.* 2012; Sha *et al.* 2020), but in other places and times, grassland carbon fluxes can be in equilibrium (neither a source or sink) (Hao *et al.* 2017), a net carbon source (Kuzyakov and Gavrichkova 2010), or fluctuate between states (Dai *et al.* 2014; Zhang *et al.* 2020).

Livestock grazing is a major land-use category by which human activities can influence the structure and function of grassland ecosystems, profoundly altering the carbon cycle and stability of grassland productivity (Zhang *et al.* 2023). Grazing directly affects plant productivity and respiration because livestock foraging removes leaves while promoting compensatory growth, and their trampling and excretion redistributes soil organic matter and alters soil respiration (Cao *et al.* 2004; Chen *et al.* 2015; Barthelemy *et al.* 2018; Veldhuis *et al.* 2018); Grazing also alters soil nitrogen content and other processes important to the carbon cycle, such as litter decomposition and photosynthate distribution (Xia and Wan 2008). As a result, grazing can moderate the net ecosystem exchange of grasslands and whether they serve as a net carbon sink or source. In some cases, light to moderate levels of grazing can facilitate grasslands being net carbon sinks (Derner *et al.* 2006; Sha *et al.* 2020; Chang *et al.* 2021), while high levels of grazing can accelerate the release of carbon and switch the ecosystem from a carbon sink to a carbon source (Liang *et al.* 2017; Tang *et al.* 2018); In other cases, grazing appears to have little influence on the carbon budget of grassland ecosystems (Fang *et al.* 2010; Piñeiro *et al.* 2010).

Desert steppe is particularly vulnerable to degradation due to livestock grazing and to carbon sinks transitioning to carbon sources (Zhang *et al.* 2020). We assessed ecosystem carbon balances over a sustained 10-year period and explored the influencing factors. We concluded that precipitation patterns and grazing combine to cause changes in the carbon sink function of grasslands (Jin *et al.* 2023; Wang *et al.* 2023), but that ecosystem carbon exchange is disturbed by a combination of environmental (soil, climate) and biological (grazing) factors. How environmental and biological factors influence net ecosystem carbon exchange depends on the relationship between carbon uptake via primary productivity and carbon release via plant and soil respira-

tion. Furthermore, there is considerable variability and uncertainty regarding the factors influencing carbon exchange in grassland ecosystems (Liu *et al.* 2015; Sha *et al.* 2020). This is likely because the variability in grassland types is mediated by climate, vegetation and soil (Helfter *et al.* 2015; Hussain *et al.* 2015; Liang *et al.* 2020), as well as by grazing practices (Fang *et al.* 2010; Dai *et al.* 2014).

Thus, simply measuring net ecosystem exchange and aboveground biomass is not enough to fully understand the influence of biotic and abiotic factors on these rates (Li *et al.* 2017a; Bajgain *et al.* 2018). It is necessary to more fully identify how carbon exchange and soil respiration are influenced by grazing and background environmental factors, in particular. This information will not only help us better understand the factors influencing the carbon dynamics of these important ecosystems, but it will also help inform the formulation of policies for the sustainable management and conservation of grassland resources. In this study, we measured ecosystem carbon fluxes and their associations in response to a long-term (16-year) grazer manipulation experiment in a desert steppe grassland in Inner Mongolia, China. We specifically asked (1) how does grazing influence features of the plant community and soil conditions and (2) how those effects influence the parameters of net ecosystem carbon exchange, including gross ecosystem productivity and respiration. On the basis of our previous research, we further measured aboveground and belowground biomass, plant nutrients (carbon and nitrogen content of plant communities) and soil nutrient indexes to analyze the main drivers that influence the changes of CO<sub>2</sub> fluxes in desert steppe ecosystems and their responses to grazing disturbances, and to provide theoretical basis for the adaptive management of desert steppe.

## Methods

### Study Site

Our study took place within a long-term grazing experiment located in Siziwang Banner (41°46'43" N, 111°53'42" E, elevation 1456 m) at the comprehensive experiment and demonstration center of the Inner Mongolia Academy of Agriculture and Animal Husbandry Sciences, China. The study site is a typical desert steppe ecosystem dominated by *Stipa breviflora* Griseb., *Artemisia frigida* Willd., and *Cleistogenes songorica* (Roshev.) Ohwi. Subordinate species include *Convolvulus ammannii* Desr., *Kochia prostrata* (L.) Schrad., *Caragana stenophylla* Pojark. and *Caragana microphylla* Lam.. The soil is primarily a sandy loam texture with low nitrogen, phosphorus, and organic matter content, but high potassium. Over the course of the experiment (2004 to 2020), the average annual temperature was 3.4 and the average annual precipitation was 221.7 mm (the majority falling from June to August). We present the air temperature and precipitation during the growing season in which we collected data (2020) in Fig. S1.

### Experimental Design

A grazing manipulation experiment was established in June 2004 in a natural grassland (~50 ha) with relatively flat terrain and relatively homogeneous vegetation and soil types. The plots were divided into three experimental blocks which each received one of four grazing treatments, control (no grazing), light grazing, medium grazing and heavy grazing (thus, there were three replicates for each treatment). Each experimental plot was 4.4 ha and constructed with iron wire fencing material. The stocking rates in each treatment were 0 (control/ no grazing), 0.91 (light grazing), 1.82 (moderate grazing, MG) and 2.71 (heavy grazing) sheep unit \* (hm<sup>2</sup>A<sup>-1</sup>)<sup>-1</sup>. Each grazing plot was grazed by adult sheep from June 1 to October 1 each year. During the grazing season, the sheep were driven into the grazing area at 6:00 every day and left to forage freely until their return to the corral at 18:00.

### Measurement of aboveground biomass and belowground biomass

We measured aboveground biomass of plants from June to September 2020. In each month, we randomly selected three (1 m<sup>2</sup>) quadrats (108 quadrats in total) near the other sampling locations in each plot to record the community characteristics of plants. In each quadrat, we clipped all aboveground biomass and separated them to species. We then dried plants at 65 °C for 48 h and weighed them. We categorized species into four functional groups (perennial grass, shrub and semi-shrub, perennial forb, annual and biennial plants) based on their life type (Table S1).

We measured belowground biomass in August 2020. To do so, we selected six points near the other sampling locations and collected samples from the 0-10 cm layer with a root auger (7 cm diameter). We took two samples at each point and combined them for analyses. We picked roots from the soil, washed them and dried and weighed them as above.

### Measurement of plant total nitrogen and carbon content

We measured total carbon and total nitrogen content from three of the aboveground sampling quadrats in each plot. After weighing, we ground tissues using a ball mill and measured powder samples using an elemental analyzer (Elementar Vario MACRO CUBE).

### Measurement of soil properties

We determined several soil physical and chemical properties in August 2020 by collecting soil samples from the 0-10 cm layer. We selected six points in each plot near the other sampling points and collected soil at each point from 0-10 cm using a soil auger (3 cm diameter). At each point, we collected two soil samples, combined them, and passed soil through a 2 mm sieve for determining the physical and chemical properties of the soil in the laboratory.

For each soil sample, we determined total carbon and total nitrogen content in the soil using an elemental analyzer (Elementar Vario MACRO CUBE); total phosphorus content using an ultraviolet spectrophotometer (UV-1800, Mapada, Shanghai, China) with the sodium hydroxide fusion method; organic carbon content using the potassium dichromate external heating method; nitrate ( $\text{NO}_3^-$ -N) and ammonium ( $\text{NH}_4^+$ -N) by extraction using KCl (2 mol\*L<sup>-1</sup>) with a flow analyzer; available phosphorus content using the sodium bicarbonate molybdenum antimony anti-colorimetric method; and microbial biomass carbon and microbial biomass nitrogen using the chloroform fumigation extraction method.

### Measurement of ecosystem CO<sub>2</sub> exchange

We measured net ecosystem CO<sub>2</sub> exchange and ecosystem respiration monthly during the growing season (June to October) in 2020. To do so, we used a Li-6400 portable photosynthetic (Li-COR, USA) instrument with the static chamber method. We collected measurements between 8:00 a.m. to 12:00 p.m (Niu *et al.* 2008; Wu *et al.* 2021). For measurements, we choose a clear, cloudless and windless day as much as possible, at least three days after a rainfall. For measurements we connected a leaf chamber (50 x 50 x 50cm<sup>3</sup> transparent plexiglass box) to the portable photosynthetic instrument and installed small fan in each diagonal direction at the upper end of the glass box so that gas was fully mixed. We place the glass box on one of three aluminum sink frames (50 x 50cm<sup>2</sup>) placed randomly within each plot to ensure a smooth and airtight seal. We repeated measurements on each of the three frames.

At each sample point, we collected measurements for 120 s and CO<sub>2</sub> concentration and water exchange flux values were automatically recorded every 10 s. After these measurements, we ventilated the leaf chamber to ensure it was filled with convection-exchanged air, covered it with a black cloth to ensure no light transmission and repeated the above procedure to determine ecosystem respiration.

We measured soil respiration using an open circuit Li-8100 soil carbon flux meter (Li-COR, Inc, Lincoln, NE, USA) at the same time as the net ecosystem exchange measurements. We measured soil respiration within three PVC rings (10.5 cm in diameter and 8 cm in height) that were randomly placed 2 cm above the ground surface in each plot. Prior to measurements, we clipped plants inside the rings flush with the ground and removed debris.

We calculated net ecosystem CO<sub>2</sub> exchange (NEE) and gross ecosystem productivity (GEP) as follows:  $[?]'$   $[?]t = \text{INDEX}(\text{LINEST}(Y1: Y12, A1: A12),1)$ ;  $NEE = \frac{10VP(1-\frac{W}{1000})}{RS(T+273.15)} \frac{\partial C}{\partial t}$ ;  $NEE = GEP - ER$ .

Where ER is the measured ecosystem respiration. NEE, ER, GEP are in  $\mu\text{mol}\cdot\text{m}^{-2}\cdot\text{s}^{-1}$ , Y1-Y12 is the CO<sub>2</sub> concentration value, A1-A12 is the measurement time, V represents the volume of the box (cm<sup>3</sup>), P is the atmospheric pressure inside the box (kpa), W is the water pressure inside the chamber (mmol·mol<sup>-1</sup>), S is

the bottom area of the chamber ( $\text{cm}^2$ ),  $T$  is the temperature of the gas inside the chamber ( $^\circ\text{C}$ ), and  $R=8.314$   $\text{J}\cdot\text{mol}^{-1}\cdot\text{K}^{-1}$  (constant). We used values of ecosystem  $\text{CO}_2$  exchange and soil respiration during the growing season (June-October) to calculate the values of NEE, GEP, ER, SR for each treatment.

### Measurement of air temperature and precipitation

We collected meteorological data in 2020 using a small weather station (Gro Weather software version 1.2, Davis instruments corporation, USA). The station recorded temperature and precipitation data automatically at 1 h intervals, which we downloaded and collated at regular intervals.

### Measurement of soil temperature and moisture

In parallel with net ecosystem exchange measurements, we measured soil temperature at 10 cm depth in the leaf chamber with two TP3001 electronic thermometers. At the same time, we collected 10 cm soil samples using a 2.5 cm diameter x 10 cm high soil auger, which we collected in an aluminum box, weighed and recorded the wet mass, and then dried at  $105^\circ\text{C}$  for 24 h to weigh the dry mass and then calculate the mass water content.

### Data Analysis

After ensuring data met normality and homogeneity of variance assumptions using the Shapiro-Wilk test, we evaluated the influence of grazing treatment on aboveground and belowground biomass, plant nitrogen and carbon content, plant functional groups and several soil chemical variables, as well as the ecosystem  $\text{CO}_2$  exchange and soil respiration. To do so, we used repeated measures ANOVA to test the effects of grazing intensity and sampling month on the aboveground biomass, plant functional group biomass, ecosystem  $\text{CO}_2$  exchange and soil respiration. We used one-way ANOVA followed by a Duncan test for pairwise comparison to test the effects of grazing intensity on the belowground biomass, plant total carbon, plant total nitrogen and soil nutrient content. A  $P < 0.05$  indicated significance in the treatment effects.

We correlated several abiotic factors with ecosystem carbon exchange, including temperature, precipitation, soil temperature, and soil moisture in each treatment using regression analysis.

To investigate the influence of soil and plant factors on ecosystem carbon exchange, we used redundancy analysis to rank the impact of the factors on carbon exchange. Furthermore, we used a generalized linear model (GLM) and structural equation model (SEM) to determine the effects of plant and soil factors on ecosystem  $\text{CO}_2$  exchange and soil respiration. To do so, we first calculated the contribution of the plant and soil factors to the ecosystem  $\text{CO}_2$  exchange and soil respiration using the GLM, and then we removed insignificant pathways and simplified the SEM model based on the GLM results. We obtained path coefficients using a maximum likelihood estimation technique.

We performed ANOVA, repeated measures ANOVA and the GLM analyses in version R 4.0.3. The SEM analyses were performed using the “piecewise SEM” package (Lefcheck, 2016) in R version 4.0.3. We performed regression and redundancy analyses in Origin 2023 software.

## Results

### Grazing Intensity Effects on the Plant Functional Group Productivity and Plant Community Carbon and Nitrogen Content

We found that both aboveground (Fig. 1a) and belowground (Fig. 1b) biomass was influenced by the grazing treatment. All grazing treatments had lower aboveground and belowground biomass than the control treatment with no grazing. Aboveground biomass was lowest in the heavy grazing treatment while there were no differences between the two lower grazing intensity treatments (Fig. 1a), belowground biomass was incrementally lower with each increased grazing intensity treatment (Fig. 1b). When we analyzed differences in nutrient content, we found that the total carbon content of the plant community was lowest in the heavy grazing treatment (Fig. 1c), while the total nitrogen content of the plant community was lowest in the moderate grazing treatment (Fig. 1d). Aboveground biomass differed significantly between months,

though the difference was not significant for the interaction between month and grazing intensity (Table 1). When we divided plants into functional groups (Fig. 2b-e), we found that most groups strongly declined with increasing grazing, particularly shrubs and semi-shrubs (Fig. 2c), as well as perennial forbs (Fig. 2d). Perennial grasses, in fact, had greater biomass in the moderate grazing treatment (Fig. 2b). We performed repeated measures ANOVAs for different plant functional groups and found that most functional groups differed significantly by month, grazing intensity, and the interaction between month and grazing intensity. This was especially true for the perennial forbs, shrubs and semi-shrubs. Annuals and biennials did not differ significantly by the interaction between month and grazing intensity, and perennial grasses did not differ significantly by month, grazing intensity or the interaction between month and grazing intensity (Table 1, Fig. 2b-e).

### Grazing Intensity Effects on Soil Nutrients

Of the soil chemical variables, we found no differences in total carbon (Fig. 3a), total phosphorus (Fig. 3c), organic carbon (Fig. 3d), and microbial biomass carbon (Fig. 3g) among grazing intensity treatments. However, we found that total nitrogen (Fig. 3b), ammonium nitrogen (Fig. 3e), microbial biomass nitrogen (Fig. 3i), and available phosphorus (Fig. 3g) content tended to be lower in the highest grazing intensity treatments.

### Differences in ecosystem CO<sub>2</sub> exchange under different grazing intensities

During the 2020 growing season, we found that NEE, ER, GEP, and SR showed strong seasonal dynamics consistent with the monthly variation in precipitation (Fig. S2). According to the results of repeated measures ANOVA, NEE, ER, GEP, and SR varied significantly between months. NEE and GEP also varied significantly between grazing intensities and the interaction between month and grazing intensity, but ER and SR did not differ significantly between grazing intensities or the interaction between month and grazing intensity (Table 2). During July, NEE was positive indicating release as a carbon source (Fig. 4a); it was negative, indicating a carbon sink for the rest of the growing season. Both NEE (Fig. 4a) and GEP (Fig. 4c) were lowest in August, while ER (Fig. 4b) and SR (Fig. 4d) were highest in August. When we compared grazing treatments, we found that the rates of NEE (Fig. 4a), ER (Fig. 4b), GEP (Fig. 4c) and SR (Fig. 4d) were all significantly lower than the control plots, with the heavy grazing treatment often having lowest (or highest) values.

### plant factors and soil factors on ecosystem CO<sub>2</sub> exchange

We used RDA model to examine the relationship between the explanatory variable (plant and soil factors, blue lines with arrows) and response variable (ecosystem carbon exchange and soil respiration, red lines with arrows) in Fig. 6. We found that plant factors (e.g., above and below ground biomass, plant carbon and nitrogen nutrients) explained 98.10% of the variance of ecosystem CO<sub>2</sub> exchange and soil respiration (Axis 1 explained 71.49 % of the total variance while Axis 2 explained 26.61%; Fig. 6a). Soil factors (e.g., Soil nutrient index) explained 98.20 % of the variance of ecosystem CO<sub>2</sub> exchange and soil respiration (Axis 1 explained 73.50 % of the total variance while Axis 2 explained 24.70 %; Fig. 6b). For plant and soil factors, SS ( $R^2 = 0.36$ ) contributed the highest degree of variance to NEE, and next highest was AGB ( $R^2 = 0.21$ , Fig. 5c); AGB ( $R^2 = 0.28$ ) contributed the highest degree of variance to GEP, and next highest was SS ( $R^2 = 0.22$ , Fig. 5E); BGB ( $R^2 = 0.25$ ,  $R^2 = 0.23$ ) contributed the highest degree of variance to ER and SR (Fig. 5d, Fig. 5f);

Based on the results of the redundancy and GLM analyses, we developed structural equation models to better explain the driving mechanisms of ecosystem carbon exchange and soil respiration. Our SEM analysis showed that grazing had a direct negative effect on NEE and GEP. Specifically, grazing reduced NEE and GEP by reducing aboveground biomass, especially through the indirect reduction of NEE due to lower shrub and semi-shrub biomass (Fig. 6a and c). However, the lower soil nutrient content in the grazing treatment was not associated with NEE and GEP (Fig. 6e and g). In contrast, grazing and aboveground biomass did not directly affect ER and SR (Fig. 6b and d), but they did directly affect belowground biomass and indirectly reduce belowground biomass by decreasing ammonium N. This came to affect the rate of SR as

well (Fig. 7f and h).

## Discussion

Grazing by livestock influences the productivity and stability of grassland ecosystems, which in turn generates feedback mechanisms on the carbon cycle. However, the factors underlying the complex changes of vegetation and soil as a result of grazing and their impact on the processes underlying carbon cycling remain poorly understood (Yuan *et al.* 2011; Hussain *et al.* 2015; Oram *et al.* 2023; Zaret *et al.* 2023). Our results from a 16-year long grazing intensity manipulation study in a desert steppe grassland show that grazers alter patterns of net ecosystem exchange primarily via their negative influence on the biomass of shrub and semi-shrub, which play a prominent role in ecosystem functions.

### Effect of grazing intensity on net ecosystem CO<sub>2</sub> exchange

Grazing can shift the balance between vegetation being a carbon source or sink in steppe grasslands (de la Motte *et al.* 2018; Ondier *et al.* 2021). Our finding that NEE, ER, and GEP decreased with increasing grazing intensity is consistent with previous results from desert steppe (Jin *et al.* 2023; Wang *et al.* 2023). Our finding that heavy grazing had a stronger inhibitory effect on ER than GEP is consistent with the results of Peng *et al.* (2007). This may have resulted because livestock feeding reduces the aboveground biomass which cannot be compensated by regrowth (Zhang *et al.* 2018; Zhang *et al.* 2023), such that the effective amount of leaf area available for both photosynthesis and respiration is reduced so that the net CO<sub>2</sub> exchange rate decreases (Oba *et al.* 2000; Shi *et al.* 2022).

Although our finding of the positive correlation between productivity and NEE is consistent with many previous studies (Danielewska *et al.* 2015; Xu *et al.* 2022), we also found a positive correlation between aboveground biomass and NEE, primarily driven by shrubs and semi-shrubs and perennial forbs, which is consistent with previous work (Zhang *et al.* 2023). Our finding that shrubs and semi-shrubs and perennial forbs were strongly influenced by grazing, while grasses were less so is consistent with the idea that shrubs and semi-shrubs and perennial forbs are more palatable and have higher nutritional value than grasses, mainly *stipa breviflora*, which are not preferred by livestock. Shrub roots can reach up to 70 cm deep into the soil layer, allowing them to better utilize deeper water and nutrients to maintain a high carbon fixation capacity and a high net carbon uptake capacity (Niu *et al.* 2023). which can explain why their loss dramatically influenced NEE.

Our finding that plant N content is negatively correlated with net ecosystem CO<sub>2</sub> exchange is inconsistent with previous findings that loss of leaf N attenuates ecosystem carbon cycling (Wang *et al.* 2014 in Chinese)(Gong *et al.* 2021), This may be because altered plants allocated more N to non-photosynthetic proteins to increase their compensatory growth in response to grazing, but with reduced photosynthetic capacity (Onoda *et al.* 2004), resulting in a decrease in net CO<sub>2</sub> exchange rate (Zhang *et al.* 2006). A study by Wu *et al.* (2021) showed that N addition in desert steppe increased the net CO<sub>2</sub> exchange rate, while You *et al.* (2016) showed that high levels of N addition inhibited NEE, but moderate levels promoted NEE. This suggests that the changes of nitrogen absorbed and used by plants are complex and require further investigation (Schimel *et al.* 2001).

Although NEE decreased in response to increasing grazing intensity, it is of interest that there was no significant difference in NEE rates between the LG and MG treatments in our study (Fig. 4a, bars), because although short-flowered needlegrass was a well-established species and widely distributed in our experimental sample plots, livestock did not prefer it, resulting in no significant difference in vegetation stock and cover between the LG and MGC treatments and the non-grazed areas, so their net CO<sub>2</sub> exchange rates were not significantly different from those of ck. The net CO<sub>2</sub> exchange rate was not significantly different from that of CK ( $p > 0.05$ , Fig. S1a).

Although NEE decreased in response to increasing grazing intensity, we found no difference in NEE rates between the light and moderate grazing treatments. This was likely because less preferred grasses dominated both treatments.

## Effect of grazing intensity on soil respiration

Desert steppe is sparsely vegetated, so soil respiration is likewise an important determinant of carbon balance in the ecosystem. The rate of SR decreased with grazing intensity (Fig. 4d, bars), and belowground biomass (Fig. S1b), ammonium N (Fig. S2e), and available P (Fig. S2g) also significantly decreased ( $p < 0.05$ ), but the effect of different grazing intensities on soil organic carbon was not significant ( $p > 0.05$ , Fig. S2d). In this study, belowground biomass, available P, and soil organic carbon were all significantly correlated with SR based on redundancy analysis. We further constructed structural equations and the results showed that grazing did not directly affect SR, but indirectly reduced the rate of SR by decreasing belowground biomass and ammonium N (Fig. 7b).

Belowground biomass is highly correlated with soil respiration (Pregitzer *et al.* 2008; Wu *et al.* 2016; Diao *et al.* 2022). Higher CO<sub>2</sub> fluxes may be caused by higher root biomass, which can promote soil respiration by releasing more secretions at the inter-root level and providing a favorable environment for soil microbial respiration (Wu *et al.* 2016). In contrast, heavy grazing reduced above- and belowground biomass, thus reducing the amount of root growth, soil microbial load and soil enzyme activity, which likely led to the inhibition of microbial respiration and ultimately reduced soil respiration rate (Li *et al.* 2013).

In addition, based on the GLM and SEM analyses, we also found that soil ammonium N content correlated with respiration (Fig. 5d and f, Fig. 6f and h), which is consistent with the result that nitrogen addition can stimulate soil respiration in nutrient-poor soil (Smith, 2005). The affinity of dissolved oxygen and aeration tissue for NH<sub>4</sub><sup>+</sup> and NO<sub>3</sub><sup>-</sup> in root respiration mainly depends on NH<sub>4</sub><sup>+</sup>, which is enhanced when NH<sub>4</sub><sup>+</sup> is absorbed. The enhancement of glutamate dehydrogenase regulation and amino acid metabolic reactions increases root N use efficiency and promotes root growth (Knapp *et al.* 2017). Thus, the change in soil ammonium N content is one of the main factors influencing soil respiration (Onoda *et al.* 2004; LeBauer and Treseder, 2008; Gong *et al.* 2021).

## Effects of climate variables on ecosystem carbon exchange and soil respiration

As expected, we found that NEE, ER and GEP were all influenced by precipitation which was highest in July and August (Fig. S1, Fig. S2b). This is likely primarily a result of the influence of aboveground biomass and its influence on productivity and ecosystem carbon exchange, which is strongly influenced by variation in rainfall (Jobbágy *et al.* 2002). We also showed that soil moisture was positively correlated with ER and SR (Fig. S2d), which likely promoted the growth of plant roots to enhance microbial activity and promote organic matter decomposition, leading to an increase soil respiration (Helfter *et al.* 2015; Peng *et al.* 2015). This is consistent with previous studies in desert steppe (Jin *et al.* 2023; Wang *et al.* 2023).

Likewise, variation in temperature influences ecosystem carbon exchange mainly by affecting GEP and ER (Luo *et al.* 2001; Ganjurjavet *et al.* 2018; Li *et al.* 2019). However, consistent with our results showing a minimal influence of temperature on ecosystem carbon exchange in a desert steppe (Fig. S2a), WU *et al.* (2021) found similar results in a 12-year study. We did, however, find that variation in soil temperature contributed to ER (Fig. S2c), which was consistent with results from a previous analysis.

## Conclusions

In this study, we assessed the impact of different levels of grazing intensity, as well as the associated direct and indirect effects, on ecosystem carbon exchange and soil respiration. Over the course of the growing season, we found that the desert steppe remained in a state of carbon uptake (carbon sink) under the conditions of 16 years of continuous grazing. Our study shows that alter patterns of net ecosystem exchange primarily via their negative influence on the biomass of shrubs and semi-shrubs. In addition, grazing-induced reduction belowground biomass, as well as in total plant nitrogen and soil ammonium nitrogen, can strongly influence ecosystem carbon exchange and soil respiration. When nitrogen is lost from the soil due to grazing, plants reallocate resources belowground to maintain growth and development, thus promoting photosynthesis and respiration.

## Author contributions

**Xin Ju** : Data curation (equal); formal analysis (lead); investigation (lead); methodology (lead); resources (equal); software (lead); visualization (lead); writing-original draft (lead); writing-review and editing (lead). **Bingying Wang** and **Xiaoja Zhang** : Data curation (Equal). **Qian Wu** : Conceptualization (lead); funding acquisition (lead); project administration (lead); supervision (lead); validation (lead); Writing-review & editing (Lead). **Guodong Han** : Conceptualization (lead); funding acquisition (lead); project administration (lead); supervision (lead); validation (lead).

### Data availability statement

The data that support the findings of this study are available in the Supporting Information of this article.

### Acknowledgments

We thank Ting-Ting Shen, Yu-Xin Wang, Feng-Miao Zhao for continuously collecting data in the field and for the laboratory analysis during the study period. We thank the Key Laboratory of Grassland Resources of the Ministry of Education (Inner Mongolia Agricultural University) for their support, and also thank anonymous referees for their constructive comments that significantly. This study was financially supported by High-Level Talent Research Project of Inner Mongolia Agricultural University (NDYB2020-5), National Natural Science Foundation of China (32192463).

### References

- Bajgain R, Xiao XM, Basara J, *et al.* (2018) Carbon dioxide and water vapor fluxes in winter wheat and tallgrass prairie in central Oklahoma. *Sci Total Environ* **644** :1511-1524.
- Barthelemy H, Stark S, Michelsen A, *et al.* (2018) Urine is an important nitrogen source for plants irrespective of vegetation composition in an Arctic tundra: Insights from a N-15-enriched urea tracer experiment. *Journal of Ecology* **106** :367-378.
- Cao GM, Tang YH, Mo WH, *et al.* (2004) Grazing intensity alters soil respiration in an alpine meadow on the Tibetan plateau. *Soil Biol Biochem* **36** :237-243.
- Chang JF, Ciais P, Gasser T, *et al.* (2021) Climate warming from managed grasslands cancels the cooling effect of carbon sinks in sparsely grazed and natural grasslands. *Nat Commun* **12** :10.
- Chen J, Shi WY, Cao JJ. (2015) Effects of grazing on ecosystem CO<sub>2</sub> exchange in a meadow grassland on the Tibetan Plateau during the growing season. *Environ Manage* **55** :347-359.
- Dai EF, Zhai RX, Ge QS, *et al.* (2014) Detecting the storage and change on topsoil organic carbon in grasslands of Inner Mongolia from 1980s to 2010s. *J Geogr Sci* **24** :1035-1046.
- Danielewska A, Urbaniak M, Olejnik J. (2015) Growing season length as a key factor of cumulative net ecosystem exchange over the pine forest ecosystems in Europe. *Int Agrophys* **29** :129-135.
- Diao HJ, Chen XP, Wang G, *et al.* (2022) The response of soil respiration to different n compounds addition in a saline-alkaline grassland of northern China. *J Plant Ecol* **15** :897-910.
- de la Motte LG, Mamadou O, Beckers Y, *et al.* (2018) Rotational and continuous grazing does not affect the total net ecosystem exchange of a pasture grazed by cattle but modifies CO<sub>2</sub> exchange dynamics. *Agric Ecosyst Environ* **253** :157-165.
- Derner JD, Boutton TW, Briske DD. (2006) Grazing and ecosystem carbon storage in the North American Great Plains. *Plant Soil* **280** :77-90.
- Fang JY, Yang YH, Ma WH, *et al.* (2010) Ecosystem carbon stocks and their changes in China's grasslands. *Sci China-Life Sci* **53** :757-765.
- Ganjurjav H, Hu GZ, Wan YF, *et al.* (2018) Different responses of ecosystem carbon exchange to warming in three types of alpine grassland on the central Qinghai-Tibetan Plateau. *Ecol Evol* **8** :1507-1520.

- Gong CJ, Wang AZ, Yuan FH, *et al.* (2021) Effects of soil nitrogen addition on crown CO<sub>2</sub> exchange of *fraxinus mandshurica* Rupr. Saplings. *Forests* **12** :19.
- Hafner S, Unteregelsbacher S, Seeber E, *et al.* (2012) Effect of grazing on carbon stocks and assimilate partitioning in a Tibetan montane pasture revealed by 13CO<sub>2</sub> pulse labeling. *Global Change Biology* **18** :528-538.
- Hao YB, Zhou CT, Liu WJ, *et al.* (2017) Aboveground net primary productivity and carbon balance remain stable under extreme precipitation events in a semiarid steppe ecosystem. *Agric For Meteorol* **240** :1-9.
- Helfter C, Campbell C, Dinsmore KJ, *et al.* (2015) Drivers of long-term variability in CO<sub>2</sub> net ecosystem exchange in a temperate peatland. *Biogeosciences* **12** :1799-1811.
- Hussain MZ, Saraswathi G, Lalrammawia C, *et al.* (2015) Leaf and ecosystem gas exchange responses of buffel grass-dominated grassland to summer precipitation. *Pedosphere* **25** :112-123.
- Jin YX, Tian DS, Li JW, *et al.* (2023) Water causes divergent responses of specific carbon sink to long-term grazing in a desert grassland. *Sci Total Environ* **873** :8.
- Jobbagy EG, Sala OE, Paruelo JM. (2002) Patterns and controls of primary production in the Patagonian steppe: A remote sensing approach. *Ecology* **83** :307-319.
- Knapp AK, Ciais P, Smith MD. (2017) Reconciling inconsistencies in precipitation-productivity relationships: implications for climate change. *New Phytol* **214** :41-47.
- Kuzyakov Y, Gavrichkova O. (2010) Time lag between photosynthesis and carbon dioxide efflux from soil: a review of mechanisms and controls. *Global Change Biology* **16** :3386-3406.
- LeBauer DS, Treseder KK. (2008) Nitrogen limitation of net primary productivity in terrestrial ecosystems is globally distributed. *Ecology* **89** :371-379.
- Lefcheck JS. (2016) PIECEWISESEM: Piecewise structural equation modelling in R for ecology, evolution, and systematics. *Methods Ecol Evol* **7** :573-579.
- Lei TJ, Feng J, Zheng CY, *et al.* (2020) Review of drought impacts on carbon cycling in grassland ecosystems. *Front Earth Sci* **14** :462-478.
- Li F, Peng YF, Zhang DY, Yang GB, *et al.* (2019) Leaf area rather than photosynthetic rate determines the response of ecosystem productivity to experimental warming in an Alpine steppe. *J Geophys Res-Biogeosci* **124** :2277-2287.
- Li GY, Han HY, Du Y, *et al.* (2017a) Effects of warming and increased precipitation on net ecosystem productivity: A long-term manipulative experiment in a semiarid grassland. *Agric For Meteorol* **232** :359-366.
- Li XD, Zhang CP, Fu H, *et al.* (2013) Grazing exclusion alters soil microbial respiration, root respiration and the soil carbon balance in grasslands of the Loess Plateau, Northern China. *Soil Sci Plant Nutr* **59** :877-887.
- Li ZY, Wu WZ, Liu XH, *et al.* (2017b) Land use/cover change and regional climate change in an arid grassland ecosystem of Inner Mongolia, China. *Ecol Model* **353** :86-94.
- Liang W, Lu YH, Zhang WB, *et al.* (2017) Grassland gross carbon dioxide uptake based on an improved model tree ensemble approach considering human interventions: global estimation and covariation with climate. *Global Change Biology* **23** :2720-2742.
- Liang W, Zhang WB, Jin Z, *et al.* (2020) Estimation of global grassland net ecosystem carbon exchange using a model tree ensemble approach. *J Geophys Res-Biogeosci* **125** :20.

- Liu YY, van Dijk A, de Jeu RAM, *et al.* (2015) Recent reversal in loss of global terrestrial biomass. *Nat Clim Chang* **5** :470-474.
- Luo YQ, Wan SQ, Hui DF, *et al.* (2001) Acclimatization of soil respiration to warming in a tall grass prairie. *Nature* **413** :622-625.
- Martens CS, Shay TJ, Mendlovitz HP, *et al.* (2004) Radon fluxes in tropical forest ecosystems of Brazilian Amazonia:: night-time CO<sub>2</sub> net ecosystem exchange derived from radon and eddy covariance methods. *Global Change Biology* **10** :618-629.
- Niu SL, Wu MY, Han Y, *et al.* (2008) Water-mediated responses of ecosystem carbon fluxes to climatic change in a temperate steppe. *New Phytol* **177** :209-219.
- Niu YY, Li YQ, Liu W, *et al.* (2023) Effects of environment factors on the carbon fluxes of semi-fixed sandy land recovering from degradation. *Front Ecol Evol* **11** :14.
- Oba G, Mengistu Z, Stenseth NC. (2000) Compensatory growth of the African dwarf shrub *Indigofera spinosa* following simulated herbivory. *Ecol Appl* **10** :1133-1146.
- Ondier JO, Okach DO, Onyango JC, *et al.* (2021) Ecosystem productivity and CO<sub>2</sub> exchange response to the interaction of livestock grazing and rainfall manipulation in a Kenyan savanna. *Environ Sustain Indic* **9** :8.
- Onoda Y, Hikosaka K, Hirose T. (2004) Allocation of nitrogen to cell walls decreases photosynthetic nitrogen-use efficiency. *Funct Ecol* **18** :419-425.
- Oram NJ, Ingrisch J, Bardgett RD, *et al.* (2023) Drought intensity alters productivity, carbon allocation and plant nitrogen uptake in fast versus slow grassland communities. *Journal of Ecology* **19** .
- Peng F, You QG, Xu MH, *et al.* (2014) Effects of warming and clipping on ecosystem carbon fluxes across two hydrologically contrasting years in an Alpine Meadow of the Qinghai-Tibet Plateau. *PLoS One* **9** :14.
- Peng F, You QG, Xu MH, *et al.* (2015) Effects of experimental warming on soil respiration and its components in an alpine meadow in the permafrost region of the Qinghai-Tibet Plateau. *Eur J Soil Sci* **66** :145-154.
- Peng Y, Jiang GM, Liu XH, *et al.* (2007) Photosynthesis, transpiration and water use efficiency of four plant species with grazing intensities in Hunshandak Sandland, China. *J Arid Environ* **70** :304-315.
- Pineiro G, Paruelo JM, Oesterheld M, *et al.* (2010) Pathways of Grazing Effects on Soil Organic Carbon and Nitrogen. *Rangel Ecol Manag* **63** :109-119.
- Pregitzer KS, Burton AJ, King JS, Zak DR. (2008) Soil respiration, root biomass, and root turnover following long-term exposure of northern forests to elevated atmospheric CO<sub>2</sub> and tropospheric O<sub>3</sub>. *New Phytol* **180** :153-161.
- Rebane S, Jogiste K, Kiviste A, *et al.* (2020) C-exchange and balance following clear-cutting in hemiboreal forest ecosystem under summer drought. *Forest Ecology and Management* **472** .
- Schimel DS, House JI, Hibbard KA, *et al.* (2001) Recent patterns and mechanisms of carbon exchange by terrestrial ecosystems. *Nature* **414** :169-172.
- Schuman GE, Janzen HH, Herrick JE. (2002) Soil carbon dynamics and potential carbon sequestration by rangelands. *Environ Pollut* **116** :391-396.
- Scurlock JMO, Hall DO. (1998) The global carbon sink: a grassland perspective. *Global Change Biology* **4** :229-233.
- Sha ZY, Bai YF, Lan H, *et al.* (2020) Can more carbon be captured by grasslands? A case study of Inner Mongolia, China. *Sci Total Environ* **723** :14.

Shi LA, Lin ZR, Tang SM, *et al.* (2022) Interactive effects of warming and managements on carbon fluxes in grasslands: A global meta-analysis. *Agric Ecosyst Environ* **340** :11.

Smith P. (2014) Do grasslands act as a perpetual sink for carbon? *Global Change Biology* **20** :2708-2711.

Smith VR. (2005) Moisture, carbon and inorganic nutrient controls of soil respiration at a sub-Antarctic island. *Soil Biol Biochem* **37** :81-91.

Tang XL, Zhao X, Bai YF, *et al.* (2018) Carbon pools in China’s terrestrial ecosystems: New estimates based on an intensive field survey. *Proc Natl Acad Sci U S A* **115** :4021-4026.

Veldhuis MP, Gommers MI, Olf H, *et al.* (2018) Spatial redistribution of nutrients by large herbivores and dung beetles in a savanna ecosystem. *Journal of Ecology* **106** :422-433.

Wang M, Fu X, Shi F, *et al.* (2014) Compensatory growth responding to clipping: a case study in a subtropical grassland northeast of Chongqing grassland northeast of Chongqing(in Chinese). *Chinese Journal of Applied and Environmental Biology* **20** (3): 474-483.

Wang YB, Zhao QG, Wang ZW, *et al.* (2023) Overgrazing leads to decoupling of precipitation patterns and ecosystem carbon exchange in the desert steppe through changing community composition. *Plant Soil* **486** :607-620.

Wu JJ, Goldberg SD, Mortimer PE, *et al.* (2016) Soil respiration under three different land use types in a tropical mountain region of China. *J Mt Sci* **13** :416-423.

Wu Q, Ren HY, Bisseling T, *et al.* (2021) Long-term warming and nitrogen addition have contrasting effects on ecosystem carbon exchange in a Desert Steppe. *Environ Sci Technol* **55** :7256-7265.

Xia JY, Wan SQ. (2008) Global response patterns of terrestrial plant species to nitrogen addition. *New Phytol* **179** :428-439.

Xu MJ, Sun Y, Zhang T, *et al.* (2022) Biotic effects dominate the inter-annual variability in ecosystem carbon exchange in a Tibetan alpine meadow. *J Plant Ecol* **15** :882-896.

Yuan W, Luo Y, Liang S, *et al.* 2011. Thermal adaptation of net ecosystem exchange. *Biogeosciences* **8** :1453-1463.

Zaret M, Kinkel L, Borer ET, *et al.* (2023) Soil nutrients cause threefold increase in pathogen and herbivore impacts on grassland plant biomass. *Journal of Ecology* :**12** .

Zhang F, Bennett JA, Zhang B, *et al.* (2023) Cessation of grazing stabilizes productivity through effects on species asynchrony and stability of shrub/semi-shrub plants in arid grasslands. *Agric Ecosyst Environ* **348** :10.

Zhang R, Zhao XY, Zuo XA, *et al.* (2020) Drought-induced shift from a carbon sink to a carbon source in the grasslands of Inner Mongolia, China. *Catena* **195** :11.

Zhang RY, Wang ZW, Han GD, *et al.* (2018) Grazing induced changes in plant diversity is a critical factor controlling grassland productivity in the Desert Steppe, Northern China. *Agric Ecosyst Environ* **265** :73-83.

Zhou W, Huang L, Yang H, *et al.* (2019) Interannual variation in grassland net ecosystem productivity and its coupling relation to climatic factors in China. *Environ Geochem Health* **41** :1583-1597.

**Table 1:** Repeated-measures ANOVA for above-ground biomass and biomass of plant functional groups.

plant biomass	Month	Month	Grazing intensity	Grazing intensity	Month × Grazing intensity	Month × Grazing
	<i>F</i> value	<i>P</i> value	<i>F</i> value	<i>P</i> value	<i>F</i> value	<i>P</i> value
AGB(g·m <sup>-2</sup> )	6.59	0.002	10.91	0.003	0.63	0.75
PG(g·m <sup>-2</sup> )	1.78	0.18	1.77	0.24	0.53	0.83

plant biomass	Month	Month	Grazing intensity	Grazing intensity	Month × Grazing intensity	Month × Grazing intensity
SS(g·m <sup>-2</sup> )	4.22	0.02	10.62	0.004	2.22	0.05
PF(g·m <sup>-2</sup> )	9.74	0.001	8.28	0.008	3.96	0.003
AB(g·m <sup>-2</sup> )	19.62	0.001	4.66	0.025	0.97	0.49

The  $F$  values are presented together with their levels of significance. AGB, PG, SS, PF and AB represent aboveground biomass, perennial grass biomass, shrub and semi-shrub biomass, perennial forb biomass and annual and biennial plant biomass.

**Table 2:** Repeated-measures ANOVA for ecosystem carbon fluxes and soil respiration.

ecosystem fluxes	Month	Month	Grazing intensity	Grazing intensity	Month × Grazing intensity	Month × Grazing intensity
	$F$ value	$P$ value	$F$ value	$P$ value	$F$ value	$P$ value
NEE( $\mu\text{mol}\cdot\text{m}^{-2}\cdot\text{s}^{-1}$ )	1280.10	0.001	32.56	0.004	7.59	0.001
ER( $\mu\text{mol}\cdot\text{m}^{-2}\cdot\text{s}^{-1}$ )	190.52	0.001	2.28	0.16	3.64	0.06
GEP( $\mu\text{mol}\cdot\text{m}^{-2}\cdot\text{s}^{-1}$ )	1082.33	0.001	40.77	0.001	8.02	0.001
SR( $\mu\text{mol}\cdot\text{m}^{-2}\cdot\text{s}^{-1}$ )	48.76	0.001	1.98	0.2	1.42	0.21

The  $F$  values are presented together with their levels of significance. NEE, ER, GEP and SR represent net exchange of ecosystem CO<sub>2</sub>, ecosystem respiration, gross ecosystem productivity and soil respiration.

### Figure legends

**Figure 1:** The effects of grazing intensity on plant aboveground biomass, belowground biomass, plant community carbon and nitrogen content. Different lowercase letters indicate significant differences between means at  $p < 0.05$ . Error bars are  $\pm$  SE, Codes of different treatments are as follows: CK, control/no grazing; LG, light grazing; MG, moderate grazing; HG, heavy grazing.

**Figure 2:** The effects of grazing intensity and month on plant aboveground biomass and biomass of plant functional groups. Each panel represents a different grouping of plant biomass. Different lowercase letters indicate significant differences between means at  $p < 0.05$ . Error bars are  $\pm$  SE, and the lines in panels b-e show the biomass of each plant functional group during the 2020 growing season. Codes of different treatments are as follows: CK, control/no grazing; LG, light grazing; MG, moderate grazing; HG, heavy grazing.

**Figure 3:** The effects of grazing intensity on soil nutrients. Different lowercase letters indicate significant differences between means at  $p < 0.05$ . Error bars are  $\pm$  SE. Codes of different treatments are as follows: CK, control / no grazing; LG, light grazing; MG, moderate grazing; HG, heavy grazing.

**Figure 4:** Monthly dynamics of ecosystem fluxes. Panels show the mean value ( $\pm$ SE) of net exchange of ecosystem CO<sub>2</sub> (a, NEE), ecosystem respiration (b, ER), gross ecosystem productivity (c, GEP) and soil respiration (d, SR) in the growing season (June-October) of 2020. The inset reflects the differences between treatments in the 2020 growing season, where positive and negative values represent net carbon release and uptake by the ecosystem and do not indicate the magnitude of the values. Different lowercase letters indicate significant differences between treatments ( $p < 0.05$ ), Codes of different treatments are the same as in Figure 3.

**Figure 5:** Biplot of ecosystem carbon exchange (NEE, ER, GEP, SR) from redundancy analysis (RDA) for plant factors (a) and soil factors (b). GLM analysis was used to study the contribution of the plant and soil factors to the net exchange of ecosystem CO<sub>2</sub> (c, NEE), ecosystem respiration (d, ER), gross ecosystem productivity (e, GEP) and soil respiration (f, SR). a-b, Ecosystem carbon exchange is represented as red lines with arrows; plant factors (a) and soil factors (b) are represented as blue lines with arrows.

The length of the line indicates the magnitude of the correlation between the explanatory variable and ecosystem carbon exchange. The angle between the lines indicates the correlation between the variables, and the angle between the red and blue arrows is less than 90° for positive correlations. Codes of different plant factors (a) are as follows: AGB, aboveground biomass; BGB, belowground biomass; PG, perennial grass biomass; AB, annual and biennial plant biomass; PF, perennial forb biomass; SS, shrub and semi-shrub biomass; PTC, plant total carbon; PTN, plant total nitrogen; C/N, the ratio of total plant carbon content to total plant nitrogen content. Codes of different soil factors (b) are as follows: TC, total carbon; TN, total nitrogen; TP, total phosphorus; SOC, organic carbon; AN, ammonium nitrogen; NN, nitrate nitrogen; AP, available phosphorus; MBC, microbial biomass carbon; MBN, microbial biomass nitrogen. c-f, Importance of individual environmental variables across models for ecosystem carbon exchange is shown for each indicator as variable importance weighted by % of R<sup>2</sup>.

**Figure 6:** Structural equation models (SEM) examining the standard total effects of plant and soil factors on Ecosystem carbon exchange under different grazing intensities. Boxes stand for measured variables in the model. Standardized path coefficients are given. Solid black lines represent positive paths ( $p < 0.05$ ), solid red lines represent negative paths ( $p < 0.05$ ), and dotted black arrows represent non-significant paths ( $p > 0.05$ ).

### Supplementary Material

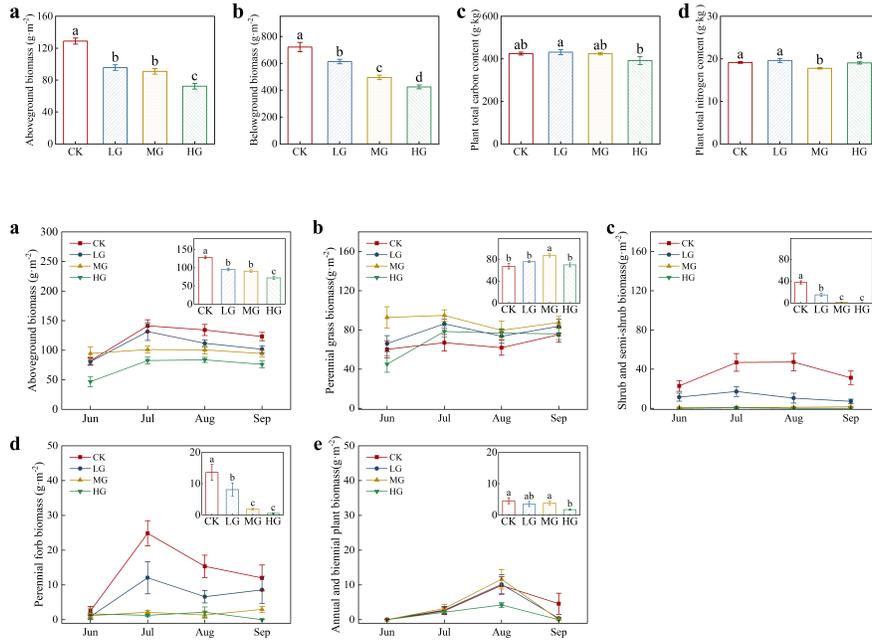
**Table S1:** Basic information on plant species and plant functional groups during 2020 at the study site.

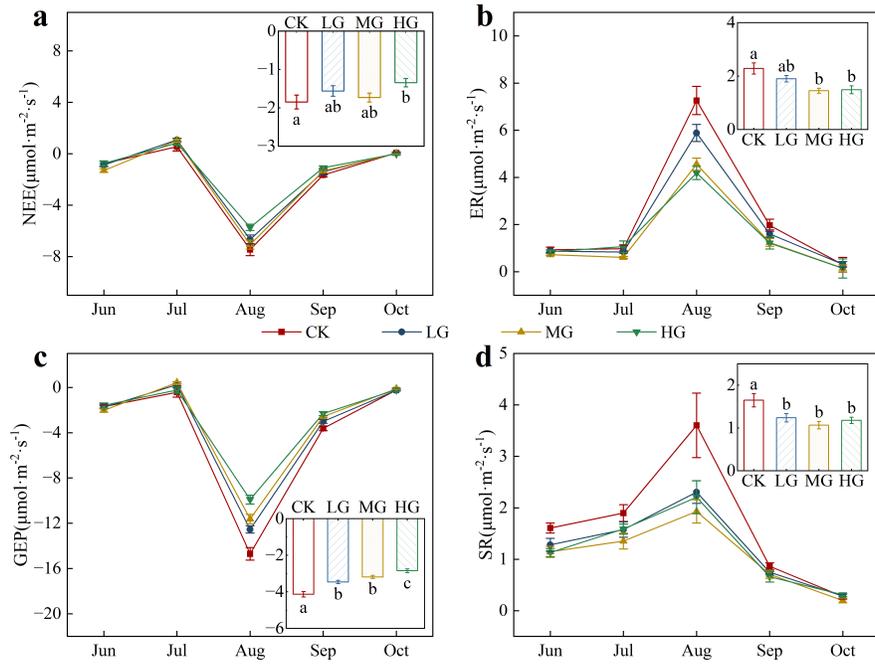
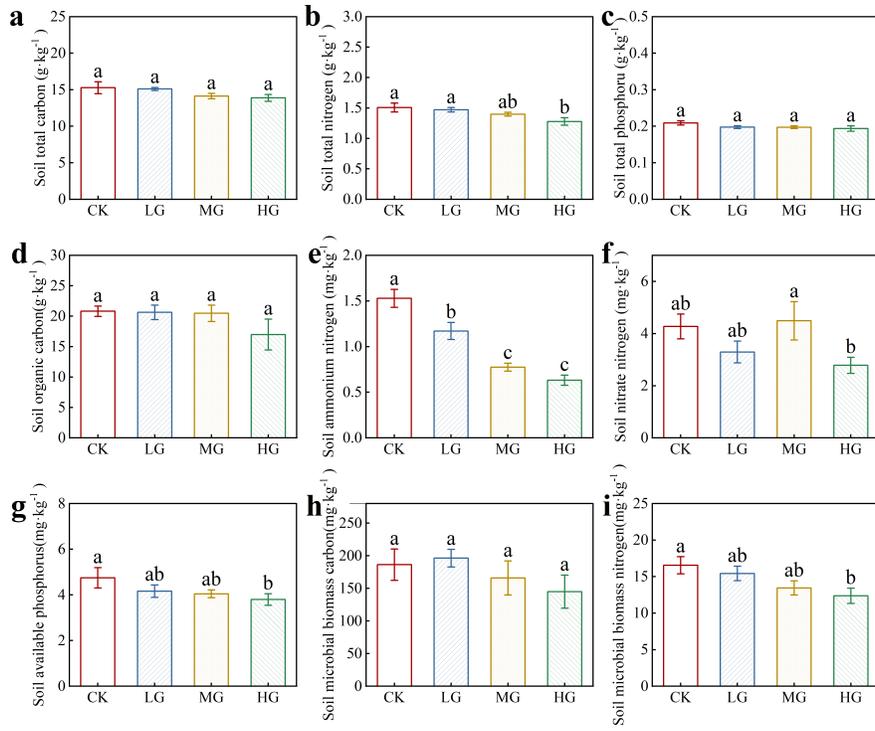
Latin name of species	Plant functional groups
<i>Stipa breviflora</i> Griseb.	perennial grass
<i>Stipa krylovii</i> Roshev.	perennial grass
<i>Cleistogenes songorica</i> (Roshev.) Ohwi.	perennial grass
<i>Leymus chinensis</i> (Trin.) Tzvel.	perennial grass
<i>Cleistogenes squarrosa</i> (Trin.) Keng.	perennial grass
<i>Agropyron cristatum</i> (L.) Gaertn.	perennial grass
<i>Convolvulus ammannii</i> Desr.	perennial forb
<i>Allium tenuissimum</i> L.	perennial forb
<i>Allium mongolicum</i> Regel.	perennial forb
<i>Astragalus galactites</i> Pall.	perennial forb
<i>Lagochilus ilicifolius</i> Bunge ex Benth.	perennial forb
<i>Carex pediformis</i> C. A. Mey.	perennial forb
<i>Aster altaicus</i> Willd.	perennial forb
<i>Cymbaria daurica</i> L.	perennial forb
<i>Allium ramosum</i> L.	perennial forb
<i>Iris tenuifolia</i> Pall.	perennial forb
<i>Sibbaldianthe bifurca</i> (L.) Kurtto & T. Erikss.	perennial forb
<i>Artemisia frigida</i> Willd.	subshrub
<i>Caragana microphylla</i> Lam.	shrub
<i>Caragana stenophylla</i> Pojark.	shrub
<i>Bassia prostrata</i> (L.) Beck.	subshrub
<i>Kali collinum</i> (Pall.) Akhani & Roalson.	annual and biennial plant
<i>Neopallasia pectinata</i> (Pall.) Poljak.	annual and biennial plant
<i>Artemisia scoparia</i> Waldst. et Kit.	annual and biennials plant
<i>Chenopodium glaucum</i> L.	annual and biennial plant
<i>Teloxys aristata</i> (L.) Moq.	annual and biennial plant
<i>Euphorbia humifusa</i> Willd.	annual and biennial plant
<i>Lappula myosotis</i> Moench.	annual and biennial plant

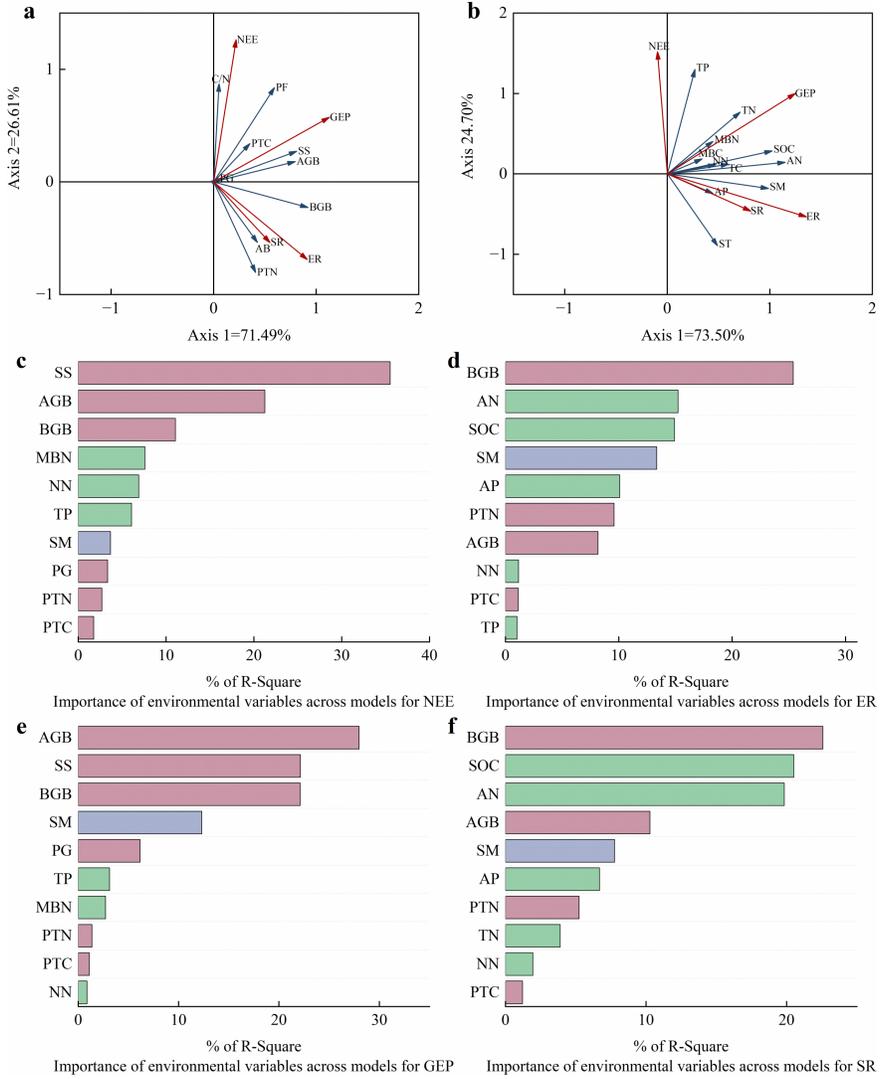
**Figure S1:** Daily mean air temperature (lines) and daily precipitation (bars) in the growing seasons in 2020.

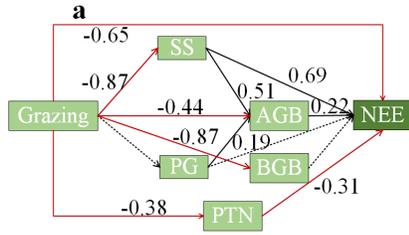
**Figure S2:** Soil temperature (a) and soil moisture (b) at 10 cm soil depth under different grazing intensity in growing seasons (June - October 2020)

**Figure S3:** Correlations between air temperature (a), precipitation (b), soil temperature (c), soil moisture (d) and ecosystem CO<sub>2</sub> fluxes (NEE, ER, GEP, SR) in the growing season of 2020.

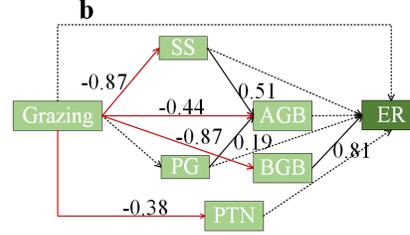




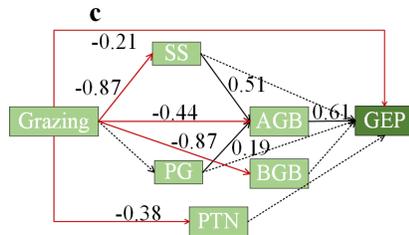




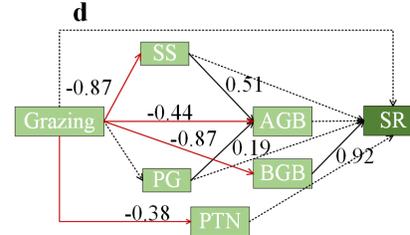
Chi-square=16.675 DF=12  $P=0.162$



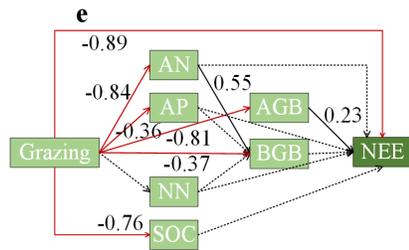
Chi-square=16.675 DF=12  $P=0.162$



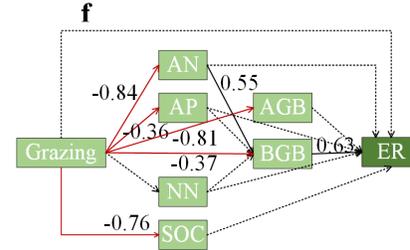
Chi-square=16.675 DF=12  $P=0.162$



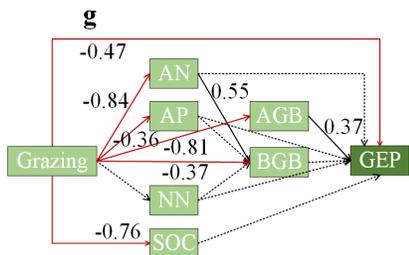
Chi-square=16.675 DF=12  $P=0.162$



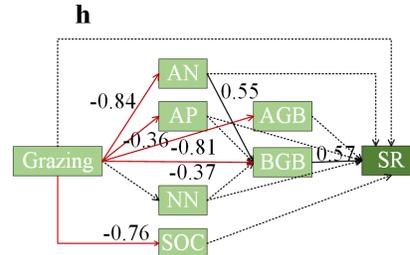
Chi-square=20.682 DF=11  $P=0.110$



Chi-square=20.682 DF=11  $P=0.110$



Chi-square=20.682 DF=11  $P=0.110$



Chi-square=20.682 DF=11  $P=0.110$

