Soil bacterial and fungal diversity differently correlated with soil biochemistry in alpine grassland ecosystems in response to environmental changes

Yong Zhang¹², Shikui Dong¹, Qingzhu Gao³, Shiliang Liu¹, Hasbagan Ganjurjav³, Xuexia Wang¹, Xukun Su¹ & Xiaoyu Wu¹

To understand effects of soil microbes on soil biochemistry in alpine grassland ecosystems under environmental changes, we explored relationships between soil microbial diversity and soil total nitrogen, organic carbon, available nitrogen and phosphorus, soil microbial biomass and soil enzyme activities in alpine meadow, alpine steppe and cultivated grassland on the Qinghai-Tibetan plateau under three-year warming, enhanced precipitation and yak overgrazing. Soil total nitrogen, organic carbon and NH₄-N were little affected by overgrazing, warming or enhanced precipitation in three types of alpine grasslands. Soil microbial biomass carbon and phosphorus along with the sucrase and phosphatase activities were generally stable under different treatments. Soil NO₃-N, available phosphorus, urease activity and microbial biomass nitrogen were increased by overgrazing in the cultivated grassland. Soil bacterial diversity was positively correlated with, while soil fungal diversity negatively with soil microbial biomass and enzyme activities. Soil bacterial diversity was negatively correlated with, while soil fungal diversity positively with soil available nutrients. Our findings indicated soil bacteria and fungi played different roles in affecting soil nutrients and microbiological activities that might provide an important implication to understand why soil biochemistry was generally stable under environmental changes in alpine grassland ecosystems.

The relationship between biodiversity and ecosystem functioning is a central issue in ecological research¹³. Belowground biodiversity strongly contributes to the maintenance of soil ecosystem functioning and shaping aboveground biodiversity¹. Bacteria and fungi are the two most abundant groups of soil microbes and are the primary consumers in the soil food web. They play different roles in regulating soil microbiological activities, e.g. specific enzyme activities and soil microbial biomass⁵–⁷, to mineralize complex organic substances⁸–⁹ and control the cycling of nutrients and carbon storage in soils¹⁰. However, the diversity of soil bacteria, fungi and soil microbiological activities and thus soil ecosystem functioning are strongly affected by human activities⁵ and climate change¹¹–¹³.

Alpine regions are sensitive to environmental changes such as climate change¹⁴–¹⁶, but biotic feedbacks, especially from soil microbes that regulate carbon and nitrogen storage in alpine soil ecosystems, are still poorly understood¹⁷,¹⁸. The Qinghai-Tibetan plateau (QTP), widely known as the “third pole” of the world, is a typical alpine region dominated by alpine meadow and alpine steppe, but is being impacted by climate change and inappropriate grazing management¹⁹,²⁰. Both short-term and long-term experiments have revealed that the storage of soil carbon and nitrogen and soil microbiological activities are relatively stable in the alpine ecosystems of the QTP under different climate warming and grazing scenarios²¹,²². The diversity of microbial functional genes

¹State Key Laboratory of Water Environment Simulation, School of Environment, Beijing Normal University, Beijing 100875, China. ²National Plateau Wetland Research Center, Southwest Forestry University, Kunming, 650224, China. ³Institute of Environment and Sustainable Development in Agriculture, Chinese Academy of Agricultural Sciences, Beijing 100081, China. Correspondence and requests for materials should be addressed to S.D. (email: dongshikui@sina.com) or Q.G. (email: gaoqzh@ami.ac.cn)
was found to be an important mechanism for maintaining the stability of soil carbon storage in alpine meadow soils under warming conditions. However, a general understanding of the roles of soil microbial diversity in maintaining soil carbon, nitrogen and soil microbiological activities under climate warming in alpine meadows is incomplete. Precipitation is predicted to increase in most regions of the QTP, and extreme climate events could become more frequent. Thus the responses of ecosystems to variable and extreme climate changes should be considered, and a better understanding of these climate change effects on soil microbial diversity and soil functioning of alpine ecosystems is needed.

We conducted this study to explore the relationships between soil microbial diversity and soil biochemistry under conditions of yak overgrazing, climate warming (both stable warming and variable warming) and enhanced precipitation in alpine meadows, alpine steppe and cultivated grasslands of the QTP. The hypotheses of this study were: (1) soil biochemical conditions would be altered by climate changes and yak overgrazing over a short time period (i.e. three years); and (2) soil bacteria and fungi diversity would play different roles in regulating soil biochemistry in response to environmental changes in alpine grassland ecosystems.

Results

Soil microbial diversity. In the alpine meadow (AM), the diversity of soil bacteria and fungi were low under the fenced, no-grazing (CK) and enhanced rainfall (ER) treatments, and high under stable warming (SW) and variable warming (VW) treatments (in comparison to the average). The fungi diversity was high, and the bacteria diversity was low under overgrazed (OG) treatment (Fig. 1a). In the alpine steppe (AS), the diversity of bacteria and fungi were low under OG and ER treatments, and high under the SW and VW treatments (Fig. 1b). In the cultivated grassland (CG), the diversity of bacteria and fungi were high under OG and ER treatments, and lower under VW treatment. The diversity of bacteria was high, and the diversity of fungi was low under SW treatment (Fig. 1c). The changes of soil microbial diversity in CK varied among different grassland types (Fig. 1).

The percentage of soil bacterial diversity (SBD) and the soil fungi diversity (SFD) of total microbial diversity was not impacted by yak overgrazing or climate change in all types of grasslands (Fig. 2a,b).

Soil nutrients. All soil nutrients varied among different grassland types. The soil NO$_3$-N changed significantly across different treatments (Table 1 and Supplementary Tables S1 and S2). There were significant interactions between treatment and grassland type on soil nutrients, excluding AP (Table 1). There were no differences in the soil TN, SOC and NH$_4$-N among all of the treatments for each type of grasslands (Table 1). Soil NO$_3$-N was considerably higher under the ER, SW and VW treatments than the OG treatment in the AM; higher under the SW and VW treatments than the CK treatment in the AS; and higher under the OG treatment than other treatments in the CG (Table 1). The soil AP was not significantly different among treatments in the AM and AS, whereas it was considerably higher under the OG and SW treatments in the CG (Table 1).

Soil microbiological activities. Two-way ANOVA revealed that the soil microbiological activities, excluding the MBP, varied among different grassland types. The urease activity and MBN were significantly affected by different treatments (Table 2 and Supplementary Tables S1 and S2). There were significant interactions between treatment and grassland type on urease activity, phosphatase activity, MBC and MBN (Table 2). The urease activity was considerably increased under the OG treatment in the AM and the CG. There was no difference in sucrase activity among all of the treatments for each grassland type (Table 2). The phosphatase activity was lower under the VW treatment than the CK in the AM, whereas it was higher under the warming treatments (both SW and VW) than the CK in the AS (Table 2). The MBC was greater under the OG treatment in the AM, whereas it decreased under the ER, SW and VW treatments in the AS. In contrast, an opposite pattern was detected in the

![Figure 1](image-url). The changes of soil microbial diversity under the fencing without grazing (CK), yak overgrazing (OG), enhanced raining (ER), stable warming (SW) and variable warming (VW) treatments in (a) alpine meadow, (b) alpine steppe and (c) cultivated grassland of the QTP.
CG (Table 2). The highest MBN was detected under the ER treatment, and the lowest under the CK treatment in the AM. In the CG, the highest MBN was detected under the OG treatment and the lowest was detected under the SW treatment. There was no difference in the MBP among all of the treatments in all types of grasslands (Table 2).

**Relationship between soil microbial diversity and soil nutrients.** In the AM, obviously positive relationships were observed between the SBD and the TN and SOC under the OG treatment (Table 3). The significant correlations between SBD and NH$_4$-N, NO$_3$-N and AP were detected under the CK and VW, OG and OG treatments, separately (Table 3). Significantly positive relationships between the SFD and the TN and SOC were detected under the CK and ER treatments (Table 3). The significant correlations between SFD and NH$_4$-N, NO$_3$-N and AP were detected under the treatments of CK and SW, ER and ER and VW, separately (Table 3). In the AS, there were significantly negative relationships between the SFD and SOC under the treatment of CK. Significantly positive correlations between SFD and NO$_3$-N were detected under the CK treatment (Table 3).

In the CG, there were significantly positive relationships between the SBD and TN and SOC under the VW treatment. The SBD and NO$_3$-N and AP were significantly correlated under the OG treatment (Table 3). The SFD and TN and SOC were significantly correlated under the treatments of CK and VW. There were significant correlations between SFD and NH$_4$-N, NO$_3$-N and AP under the CK and ER treatments and the CK and OG treatments, separately (Table 3).

The SBD and SFD showed some opposite relationship modes with soil nutrients in natural grasslands, e.g. the SBD and SFD showed opposite relationship modes with soil NO$_3$-N and AP under the OG and ER treatments in the AM (Table 3); the SBD and SFD had opposite relationships with NO$_3$-N under nearly all of the treatments in the AS (Table 3).

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Figure 2. The percentages of (a) soil bacterial diversity (SBD) and the total diversity of soil microbes, which was the summation of the diversity of soil bacteria and fungi; (b) soil fungal diversity (SFD) and the total diversity of soil microbes in the alpine meadow (AM), alpine steppe (AS) and cultivated grassland (CG) under the fencing without grazing (CK), yak overgrazing (OG), enhanced raining (ER), stable warming (SW) and variable warming (VW) treatments. NS indicates no significant difference. The mean ± s.e. is shown.
soil fungal diversity negatively affected soil microbial biomass and soil enzyme activity (Fig. 3). Moreover, soil activities, i.e. soil bacterial diversity positively affected soil microbial biomass and soil enzyme activity, while the first component of total soil nutrients and 56% of the variation in the first component of soil available nutrients 31% for the second component. The model explained 50% of the variation in the first component of soil enzyme activity and 1% for the second component. It explained 11% of the variation in the first component of soil microbial biomass and 1% for the second component. The model explained 50% of the variation in the first component of soil nutrients and 56% of the variation in the first component of soil available nutrients (Fig. 3). Soil bacterial diversity and soil fungal diversity showed opposite relationships with soil microbiological activities, i.e. soil bacterial diversity positively affected soil microbial biomass and soil enzyme activity, whereas soil fungal diversity negatively affected soil microbial biomass and soil enzyme activity (Fig. 3). Moreover, soil

### Table 1. Soil total nitrogen (TN), soil organic carbon (SOC), soil available nitrogen (NH$_4$-N and NO$_3$-N) and soil available phosphorus (AP) under the fenced, no-grazing (CK), yak overgrazing (OG), enhanced raining (ER), stable warming (SW) and variable warming (VW) treatments. In each grassland type, different letters represent significant differences at $p < 0.05$ tested by one-way factorial ANOVA ($n = 3$). The mean ± s.e. is shown. Two-way ANOVA was conducted to detect the interaction between treatments and grassland types. $F$ value is listed for the two-way ANOVA. *$P < 0.05$; **$P < 0.01$; ***$P < 0.001$. 1Log-transformation.

| Treatment | TN (g/kg) | SOC (g/kg) | NH$_4$-N (mg/kg) | NO$_3$-N (mg/kg) | AP (mg/kg) |
|-----------|-----------|------------|------------------|------------------|------------|
| Alpine meadow |           |            |                  |                  |            |
| CK        | 3.98 ± 0.51a | 38.13 ± 5.31a | 5.94 ± 0.84a | 54.26 ± 4.71ab | 9.75 ± 0.96a |
| OG        | 3.22 ± 0.27a | 31.68 ± 3.09a | 4.12 ± 0.54a | 36.91 ± 7.59b | 8.51 ± 0.89a |
| ER        | 4.04 ± 0.70a | 42.46 ± 7.69a | 5.95 ± 0.56a | 77.30 ± 5.61a | 9.30 ± 1.32a |
| SW        | 4.52 ± 0.58a | 48.28 ± 6.27a | 7.12 ± 2.00a | 88.88 ± 11.81a | 10.97 ± 1.39a |
| VW        | 4.14 ± 0.74a | 42.16 ± 7.09a | 12.13 ± 3.47a | 78.70 ± 10.29a | 10.27 ± 1.29a |
| Alpine steppe |           |            |                  |                  |            |
| CK        | 2.83 ± 0.16a | 23.38 ± 0.67a | 23.24 ± 5.07a | 22.63 ± 0.45b | 10.75 ± 0.77a |
| OG        | 3.87 ± 0.31a | 36.05 ± 1.77a | 26.87 ± 7.17a | 32.19 ± 4.69a | 14.48 ± 1.15a |
| ER        | 3.67 ± 0.30a | 31.82 ± 2.66a | 28.71 ± 4.51a | 35.73 ± 3.55ab | 12.31 ± 1.43a |
| SW        | 3.04 ± 0.17a | 25.82 ± 1.04a | 24.41 ± 4.18a | 42.29 ± 1.54a | 10.63 ± 0.56a |
| VW        | 3.53 ± 0.14a | 29.37 ± 1.01a | 19.99 ± 1.79a | 44.87 ± 3.87a | 12.76 ± 0.95a |
| Cultivated grassland |           |            |                  |                  |            |
| CK        | 1.88 ± 0.12a | 22.03 ± 1.18a | 6.22 ± 0.57a | 26.66 ± 2.67b | 5.79 ± 0.69b |
| OG        | 3.32 ± 0.38a | 37.49 ± 4.21a | 9.19 ± 1.26a | 59.44 ± 4.17a | 12.08 ± 2.09a |
| ER        | 2.37 ± 0.11a | 26.73 ± 0.91a | 7.02 ± 0.93a | 27.96 ± 2.89b | 9.45 ± 0.99ab |
| SW        | 2.59 ± 0.23a | 27.08 ± 2.10a | 13.49 ± 3.95a | 27.37 ± 0.90b | 11.04 ± 2.11a |
| VW        | 1.97 ± 0.19a | 22.24 ± 2.59a | 8.83 ± 0.55a | 23.45 ± 2.20b | 9.26 ± 0.92ab |
| Treatment  | 1.13      | 0.83      | 1.47*          | 5.91***          | 2.44*      |
| Grassland type |        |            |                |                  |            |
| OG        | 24.22***   | 23.55***   | 63.90***       | 70.51***         | 7.72**     |
| Treatment* | Grassland type | 2.33*     | 2.69*         | 2.30**          | 13.43***   | 1.98      |

**Relationships between soil microbial diversity and soil microbiological activities.** In the AM, there were significantly positive correlations between SBD and the sucrase and phosphatase activities, whereas there were weakly negative correlations between the SFD and the sucrose and phosphatase activities under the OG treatment (Table 4). Significantly correlations between SFD and urease, sucrase and phosphatase activities were detected under the CK and VW treatments and ER treatment, separately (Table 4). The correlations between soil microbial diversity (both SBD and SFD) and soil microbial biomass were weak, excluding the correlation between SFD and MBN under the VW treatment (Table 4). In the AS, more significant correlations between SFD and soil microbiological activities were detected than the SBD (Table 4). In the CG, there were significantly positive correlations between the SBD and the urease, sucrose and phosphatase activities under the OG and SW treatments, OG treatment and OG and ER treatments, separately (Table 4). The correlations between SFD and soil enzymes activities were nearly all positive and most of them were significant under the treatments of CK, OG, ER, SW and VW (Table 4). The SBD, significantly, negatively correlated with MBN and MBN under the CK and VW treatments and the OG treatment, separately. The SBD was positively correlated with the MBP under the CK treatment (Table 4). The SFD, significantly, correlated with MBN and MBN under the CK and OG treatments and the CK and ER treatments, separately (Table 4).

The SBD and SFD showed some opposite relationship modes with soil microbiological activities under different experimental treatments, e.g. significantly positive relationships were detected between SBD and sucrose and phosphatase activities whereas weakly negative correlations were observed between SBD and sucrose and phosphatase activities under the OG treatment in the AM (Table 4). In addition, the correlations between SBD (or SFD) and MBN was generally opposite to the correlations between SBD (or SFD) and MBN under all the treatments in the AS and the CG (Table 4).

**Regulation process of soil microbial diversity on soil biochemistry.** The SEM analysis showed a good fit to the data (Fig. 3), indicated by the non-significant $\chi^2$ value ($P = 0.85$), high CFI ($=1.0$), low RMSEA ($<0.001$) and low stability index ($=0.23$). The final model explained 7% of the variation in the first component of soil microbial biomass and 1% for the second component. It explained 11% of the variation in the first component of soil enzyme activity and 31% for the second component. The model explained 50% of the variation in the first component of total soil nutrients and 56% of the variation in the first component of soil available nutrients (Fig. 3). Soil bacterial diversity and soil fungal diversity showed opposite relationships with soil microbiological activities, i.e. soil bacterial diversity positively affected soil microbial biomass and soil enzyme activity, whereas soil fungal diversity negatively affected soil microbial biomass and soil enzyme activity (Fig. 3). Moreover, soil
Table 2. Soil microbiological activities under the treatments with fencing without grazing (CK), yak overgrazing (OG), enhanced raining (ER), stable warming (SW) and variable warming (VW). In each grassland type, different letters represent significant differences at overgrazing (OG), enhanced raining (ER), stable warming (SW) and variable warming (VW).

| Treatment     | SBD & TN | SBD & SOC | SBD & NH\(_4\) | SBD & NO\(_3\)-N | SBD & AP | SFD & TN | SFD & SOC | SFD & NH\(_4\) | SFD & NO\(_3\)-N | SFD & AP |
|---------------|----------|-----------|----------------|-----------------|----------|----------|-----------|----------------|-----------------|----------|
| Alpine meadow |          |           |                |                 |          |          |           |                |                 |          |
| CK            | 0.57     | 0.49      | 0.87**         | 0.29            | 0.20     | 0.67**   | 0.61*     | 0.77**         | 0.51            | 0.29     |
| OG            | 0.85**   | 0.86***   | 0.53           | 0.68**          | 0.87***  | 0.21     | 0.24      | 0.14           | 0.46            | 0.04     |
| ER            | -0.06    | -0.07     | -0.40          | -0.24           | -0.09    | 0.79**   | 0.82***   | -0.52          | 0.85***         | 0.85**   |
| SW            | -0.31    | -0.24     | -0.10          | -0.37           | -0.10    | -0.23    | -0.18     | 0.83***        | -0.43           | -0.22    |
| VW            | 0.02     | 0.06      | 0.77**         | 0.03            | 0.23     | 0.47     | 0.45      | 0.36           | 0.58*           | 0.04     |
| Alpine steppe |          |           |                |                 |          |          |           |                |                 |          |
| CK            | -0.06    | -0.24     | -0.24          | 0.12            | 0.03     | -0.10    | -0.59*    | 0.24           | 0.73**          | 0.03     |
| OG            | -0.30    | -0.01     | 0.30           | 0.05            | 0.03     | -0.39    | -0.24     | -0.49          | -0.12           | -0.53    |
| ER            | -0.34    | -0.35     | 0.43           | -0.25           | -0.26    | -0.27    | -0.33     | -0.03          | 0.38            | 0.15     |
| SW            | -0.26    | -0.21     | 0.04           | -0.28           | -0.20    | 0.25     | 0.39      | 0.29           | 0.14            | -0.28    |
| VW            | 0.27     | 0.18      | 0.39           | -0.29           | -0.16    | 0.10     | 0.14      | -0.44          | 0.52            | 0.10     |
| Cultivated grassland |        |           |                |                 |          |          |           |                |                 |          |
| CK            | 0.13     | 0.21      | 0.20           | 0.26            | -0.05    | 0.73**   | 0.81***   | 0.77**         | 0.70**          | 0.76**   |
| OG            | 0.53     | 0.45      | 0.24           | 0.58*           | 0.59*    | 0.23     | 0.22      | 0.15           | 0.77**          | 0.76**   |
| ER            | 0.01     | 0.00      | 0.32           | 0.41            | 0.18     | -0.13    | -0.20     | 0.63*          | 0.41            | 0.31     |
| SW            | 0.20     | 0.28      | -0.15          | -0.07           | -0.15    | 0.27     | 0.33      | -0.19          | -0.01           | -0.09    |
| VW            | 0.67**   | 0.75**    | -0.29          | 0.28            | -0.16    | 0.86***  | 0.90***   | -0.11          | 0.46            | 0.01     |

Table 3. The correlation index between soil microbial diversity (soil bacteria diversity, SBD; and soil fungi diversity, SFD) and soil nutrients under no grazing (CK), yak overgrazing (OG), enhanced raining (ER), stable warming (SW) and variable warming (VW) treatments (n = 9). *P < 0.1; **P < 0.05; ***P < 0.01.
bacteria and fungi showed oppositely relationships with soil nutrients, i.e., soil bacteria negatively affected while soil fungi positively affected the content of soil available nutrients (Fig. 3).

**Discussion**

We found that the treatments of OG, SW, VW and ER did not change the soil concentrations of SOC, TN and NH$_4$-N or most soil microbial activities in the alpine meadow. This was in agreement with previous results.
obtained by Wang et al.\textsuperscript{22} and Yue et al.\textsuperscript{23}. We also found that the soil biochemical indicators we measured were generally stable among treatments in the alpine steppe and the cultivated grassland, meaning that not only soil carbon and nitrogen were stable in the alpine grasslands of the QTP under changing environments\textsuperscript{26} but also soil biochemical. Our findings, however, differed from findings obtained from forest soil ecosystems\textsuperscript{27} implying that different ecosystems may respond differently to climate warming. In addition, we found that concentrations of NO\textsubscript{3}-N and AP, the activity of urease and the MBN increased greatly under the OG treatment in the cultivated grassland, supporting previous work that showed that livestock grazing enhances soil microbial activity and soil nutrient availability in fertilized ecosystems\textsuperscript{18}.

In the present study, we found that the ratio of bacteria and fungi diversity to total microbial diversity did not change considerably in the alpine meadow, the alpine steppe or the cultivated grassland under the VW, SW and ER treatments. This property might help to maintain the stability of soil microbial activity\textsuperscript{34} and to sustain the SOC and TN in alpine grassland soils. Based on these observations, we reject our first hypothesis that soil biochemistry (including soil nutrients and microbiological activities) in alpine grasslands would be altered by climate change and yak overgrazing over a short time period.

Previous studies have suggested that soil bacteria play a more important role in mineralizing carbon and nitrogen in fertile habitats whereas soil fungi are more important in infertile systems\textsuperscript{29,30}. Our results provide supporting evidence for this pattern: firstly, there were more positive relationships between the SFD and soil enzyme activity in relation to SBD among treatments in the alpine steppe as compared to the more nutrient rich alpine meadow\textsuperscript{31}; secondly, there were more positive relationships between SBD and soil enzyme activity among treatments in the fertilized cultivated grassland as compared to the alpine meadow (with same soil type as the cultivated grassland).

The roles of soil bacteria and soil fungi in decomposer systems were strongly affected by the quantity and quality of plant litter inputs\textsuperscript{10}. Soil fungi are considered more important for breaking down hard-to-decompose matter, such as cellulose and lignin, because of their mycelia networks and better mobility than soil bacteria\textsuperscript{26}. In previous studies, we found that livestock grazing decreases but warming increases the proportion of herbivore-preferred plants in alpine grasslands in the QTP\textsuperscript{25,26}. Herbivore-preferred plant species produce more slowly-decomposable litter\textsuperscript{29,30}. This implies that soil fungi might be more important decomposers under warming conditions whereas soil bacteria play a more important role when grazing pressure is high. Further evidence that supports this pattern are the mostly positive relationships we observed between the SFD and enzyme activities in the natural alpine grasslands under the warming (VW and SW) and ER treatments whereas the relationships between SBD and enzyme activities were always weak or even negative. Furthermore, more positive relationships between SBD and enzyme activities were detected compared to SFD under the OG treatment. No such patterns were detected in the cultivated grassland which might be due to fertilization effects.

In sum, the relationship between soil bacteria diversity and soil biochemistry was generally opposite to that between soil fungi diversity and soil biochemistry in alpine ecosystems under different environmental conditions. For example, the relationships between SBD and SOC, TN and enzyme activities tended to be positive in the grazing treatment and negative under warming and enhanced precipitation conditions whereas SFD showed an opposite trend. Moreover, the SEM analysis confirmed that soil bacteria and fungi oppositely affected soil microbiological activity and soil nutrients in both direct and indirect ways. In addition, the soil available nutrients negatively affected the soil microbial biomass. The opposite roles of soil bacteria and fungi diversity on soil biochemistry under different environmental conditions along with the negative effects of available nutrients on soil microbial biomass may help to stabilize soil biochemical processes leading to relatively constant nutrient levels and microbial activities in alpine grassland soils over time. These findings support our second hypothesis that soil bacteria and fungi diversity would play different roles in regulating soil biochemical conditions in response to environmental changes in alpine grassland ecosystems.

Methods and Materials

Study site description. The study sites were located in Nagqu county (31°26.580′N, 92°1.104′E, at 4 500 m a.s.l.) and Bange county (31°23.348′N, 92°1.706′E, 4748 m a.s.l.) in the Tibetan Autonomous Region of China. Alpine meadow (AM), dominated by Kobresia humilis, is the typical vegetation in Nagqu County, where the mean annual precipitation is approximately 430 mm and the mean annual temperature is around −1.2 °C (1982–2013). Alpine steppe (AS), dominated by Stipa purpurea, is the typical vegetation in Bange County, where the mean annual precipitation is approximately 330 mm and the mean annual temperature is around −0.4 °C (1982–2013). Cultivated grassland (CG) next to an alpine meadow in Nagqu County was planted with Elymus nutans in 2009 for a restoration demonstration. Farmyard manure, mixed sheep manure and yak manure, was used to fertilize the cultivated grassland.

Experimental design and sampling. In 2010, we fenced twelve 4 m × 4 m plots in each of the three grassland types, alpine meadow (AM), alpine steppe (AS) and cultivated grassland (CG) to exclude the animal grazing. These plots were similar in topography and land use histories. There was two-meter distance between each two OTCs to exclude disturbances from other factors\textsuperscript{34}, e.g. the cross movement of water, roots and soil temperature among OTCs. Three plots were randomly selected for each of the four treatments: control (CK), stable warming (SW), variable warming (VW) and enhanced raining (ER). The temperature was controlled by facilities commonly used for examining the effects of climatic warming on ecosystems\textsuperscript{34}, conical fiberglass open-top chambers (OTCs) with a 1.5 m diameter base, 0.75 m diameter top and 0.4-m height. In the temperature of the OTCs under ER was maintained at the ambient temperature outside of the OTCs, and the temperature in the SW treatment OTCs was maintained at a constant temperature of 1.55 °C higher than the ambient temperature using automated mini fans that operated according to temperature probes placed inside and outside the OTCs at 15 cm above the ground. There were no fans in the OTCs of the VW treatments, and the daily air temperature at 5 cm above the
soil surface was unevenly elevated to an average temperature of approximately 2.0°C (range 0–7°C) over ambient temperatures. In the ER treatment, precipitation was increased by 20% by collecting rainwater with pails and adding it to the OCTs after each rainfall event. For the overgrazing treatment (OG), three plots in the sizes of 50 m × 50 m were selected randomly from each type of grassland outside the fenced ones and were subjected to continual grazing by yaks at an annual stocking rate of 3 animals ha⁻¹, which is far higher than the 1–1.5 yak ha⁻¹ carrying capacity of alpine grasslands.

We collected 15 soil cores from each grassland type (5 treatments: CK, OG, SW, VW and ER; and 3 replicates (sub-plots) for each treatment) and each soil core was separated into 3 depths: 0–5 cm, 5–10 cm and 10–15 cm. A total of 45 soil cores, a total of 135 soil samples, were collected in July and August of 2013. The soil samples were sealed in polyethylene bags, stored in an icebox and then transported to labs for extraction and other analysis.

**Microbial diversity detection.** The microbial DNA was extracted from each of the 135 samples using the E.Z.N.A Soil DNA Kit (Omega Bio-tek, Norcross, GA, U.S.) following the manufacturer’s protocols. For bacteria, the V4-V5 region of the 16S rRNA gene was amplified using the forward primer 515F (5′-GTGCCAGCMGCCGCGG-3′) and the reverse primer 907R (5′-CCGTCAATTTGACTCMGGCT-3′). For fungi, the ITS rRNA gene was amplified using the primer ITS1 (5′-CTTGGTCATTTAGAGGAAGTAA-3′) and ITS2 (5′-GCTGCGTTCTTCATCGATG-3′). After purification using the AxyPrep DNA Gel Extraction Kit (Axygen Biosciences, Union City, CA, USA) and quantification using QuantiFluor™ -ST (Promega, Wisconsin, USA), a mixture of amplicons was used for sequencing on the Illumina MiSeq platform. The processes of quality control and trimming of sequencing reads were performed as described previously. Finally, there were 62,814 paired reads per sample for bacteria, and 36,788 paired reads per sample for fungi.

The operational taxonomic units (OTUs) of bacteria and fungi were defined as sharing >97% sequence identity using the furthest neighbor method (http://www.mothur.org/wiki/Cluster). Then, the species alpha diversity of the microbial community was estimated by the abundance-based coverage estimator (ACE) with OTUs data.

**Soil biochemistry measurements.** The total nitrogen (TN), soil organic carbon (SOC), NH₄-N, NO₃-N and available phosphorus (AP) were determined using methods suggested by Soon and Hendershot. The soil microbial biomass carbon (MBC), nitrogen (MBN) and phosphorus (MBP) were tested using the chloroform fumigation-extraction method. The activities of urease, sucrase and neutral phosphatase, which would benefit the mineralization of soil N and P, were determined by the method of indophenol colorimetry according to Guan and Tabatabai.

**Statistical analysis.** To detect the changes of soil microbial diversity under different treatments, the deviation from the average (DFA) was calculated by:

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(D_{ir} - D_{av}) \times 100/D_{av}
\]

where \(D_{ir}\) was the microbial diversity in specific treatment, i.e. CK, OG, ER, SW or VW; \(D_{av}\) was the average microbial diversity of all experimental treatments in specific grassland type, i.e. alpine meadow, alpine steppe or cultivated grassland. It means microbial diversity was higher than average if the DFA over zero, vice versa. The DFA of bacteria and fungi was calculated separately.

In each grassland type, one-way ANOVA was employed to test the differences among soil microbial diversity, soil nutrients (TN, SOC, NH₄-N, NO₃-N and AP) and soil microbiological activities (enzymatic activities and soil microbial biomass) among the different treatments. Two-way ANOVA was conducted to detect the interaction between treatments and grassland types. Post hoc tests (Tukey’s) were applied to test the differences among treatments and among grassland types. For each parameter, the homogeneity of variance was tested by using Levene’s test, and necessary transformations were conducted when data did not meet statistical assumptions. These analyses were conducted using IBM SPSS Statistics 19.0.

In order to explore the roles of soil bacteria and fungi diversity on affecting soil biochemistry, a Pearson’s correlation index was calculated between the soil microbial diversity, soil nutrients and soil microbiological activities using IBM SPSS Statistics 19.0. Moreover, the structural equation modeling (SEM), which could detect both direct and indirect effects among variables, was used to obtain a mechanistic understanding of how soil microbial diversity changed soil biochemistry in alpine grassland ecosystems of the QTP. To simplify the model, we reduced the number of soil chemistry variables through Principal Component Analysis (PCA). And we used the first component if the variance was explained over 50%, else we used more components (see PCA results in Supplementary Table S3). All paths were considered in the initial model and modified gradually (see Supplementary Fig. S1). Qualified model was indicated by a non-significant \(\chi^2\) test \((P > 0.05)\), high comparative fit index (CFI) \((>0.95)\) and low root mean square error of approximation (RMSEA) \(<0.05\). The proposed model was nonrecursive in this study, thus the absolute value of the stability index of the model should be less than 1. Finally, the total 135 samples, i.e. all data collected from three grassland types, were used in SEM procedure. The SEM analyses were performed using AMOS 21.0 (SPSS, Chicago).
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Author Contributions
Q.Z. Gao, H. Ganjurjav and S.K. Dong conceived and conducted the field experiments. S.K. Dong, Y. Zhang, and X.X. Wang designed and conducted the laboratory experiments. S.L. Liu, X.K. Su and X.Y. Wu helped Y. Zhang and X.X. Wang in implementing the laboratory experiments. All authors contributed towards writing the manuscript.

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