

1 **Microbial necromass contribution to topsoil organic carbon storage of natural**  
2 **and agricultural ecosystems**

3  
4 Jing-li Lu<sup>a</sup>, Thomas W. Crowther<sup>b</sup>, Manuel Delgado-Baquerizo<sup>c</sup>, Wenjie Liu<sup>a</sup>, Yamin  
5 Jiang<sup>a</sup>, Hongyang Sun<sup>d</sup>, Zhiqiang Wang<sup>d, \*</sup>

6  
7 <sup>a</sup> Hainan Baoting Tropical Forest Ecosystem Observation and Research Station,  
8 School of Ecology, Hainan University, Haikou, 570228, People's Republic of China;

9 <sup>b</sup> Institute of Integrative Biology, Department of Environmental Systems Science,  
10 ETH Zürich, 8092 Zürich, Switzerland;

11 <sup>c</sup> Laboratorio de Biodiversidad y Funcionamiento Ecosistémico, Instituto de Recursos  
12 Naturales y Agrobiología de Sevilla (IRNAS), CSIC, Seville, 41013, Spain;

13 <sup>d</sup> Sichuan Zoige Alpine Wetland Ecosystem National Observation and Research  
14 Station, College of Grassland Resources, Southwest Minzu University, Chengdu,  
15 610041, People's Republic of China

16  
17  
18 \* Corresponding author: Zhiqiang Wang

19 *E-mail address:* [wangzq@swun.edu.cn](mailto:wangzq@swun.edu.cn)

20

## 21 **Abstract**

22 Microbial necromass is an important component of soil carbon (C). Yet, the relative  
23 contribution of microbial necromass in shaping the global C stocks in agricultural and  
24 natural ecosystems worldwide remains virtually unknown. Here, we compiled data on  
25 fungal and bacterial necromass along with soil organic carbon (SOC) from the 0–20  
26 cm soil layer across 486 study sites (145 agricultural and 341 natural ecosystems) to  
27 evaluate the relative contribution of fungal necromass C (FNC) and bacterial  
28 necromass C (BNC) to SOC. Our results indicated that, on average, FNC is two times  
29 more important than BNC in explaining SOC in both agricultural and natural  
30 ecosystems. The contributions of FNC and BNC to SOC were markedly higher in  
31 agricultural ecosystems compared with natural ecosystems, with a contrasting trend in  
32 the FNC/BNC ratio. Soil physicochemical properties (soil C/N ratio and clay content)  
33 were the most important predictors of the contributions of FNC and BNC to SOC in  
34 both ecosystems, while geographical factor (elevation) was the most important  
35 predictor of the FNC/BNC ratio. Our study enhances the current level of  
36 understanding regarding microbially mediated biogeochemical cycling and SOC  
37 dynamics, underscoring the critical role of microbial necromass in the global C cycle.

38  
39 **Keywords:** agricultural ecosystems, bacterial necromass carbon, fungal necromass  
40 carbon, microbial necromass carbon, natural ecosystems

## 41 42 **1 Introduction**

43 As the largest carbon (C) pool in the terrestrial biosphere, soil organic carbon (SOC)  
44 plays a pivotal role in shaping the global C cycle and climate system (Bellamy et al.,  
45 2005; Crowther et al., 2015). In brief, plant inputs provide the primary carbon source  
46 to soils, and microbial processing transforms these inputs into microbial necromass  
47 that can persist over long turnover times (Angst et al., 2021; Cotrufo et al., 2013).  
48 Although the living soil microbial biomass typically constitutes only about 2% of  
49 SOC (a ratio referred to as the microbial quotient; Anderson & Domsch, 1989; Liu et  
50 al., 2023), microbial necromass has been shown to contribute more than half and up to  
51 approximately 80% of SOC, depending on soil type and analytical methods (Liang &  
52 Balser, 2011; Kallenbach et al., 2016; Liang et al., 2019). In other words, microbial  
53 necromass C (MNC) constitutes a substantial and critical component of stable SOC  
54 (Ma et al., 2018), and its dynamics are increasingly recognized for their role in  
55 regulating the terrestrial carbon cycle and climate feedbacks (Zhao et al., 2023). As  
56 such, there is growing scientific attention on the forces driving the accumulation of  
57 MNC and its contribution to SOC (Liang et al., 2017; Ni et al., 2020; Luo et al., 2022;  
58 Zhou et al., 2023). To gain a comprehensive understanding of MNC in the global C  
59 cycle, recent research has highlighted the distinct roles of fungal and bacterial  
60 necromass, revealing their contrasting responses to environmental and anthropogenic  
61 drivers. For instance, studies have shown that the accumulation and contribution of  
62 MNC are sensitive to factors such as aridity, primary productivity, agricultural  
63 management practices like tillage and fertilization, as well as key soil properties  
64 including pH and clay content (Zhang et al., 2021; Zhou et al., 2023; Xu et al., 2024).

65 Despite these advances, it remains unclear whether these organism-specific  
66 mechanisms translate into systematic differences in necromass contributions between  
67 ecosystems under varying degrees of human interference, such as agricultural versus  
68 natural systems.

69 With the distinct roles of fungi and bacteria in decomposing organic matter and  
70 stabilizing organic carbon in soil, the relative contribution to SOC of fungal and  
71 bacterial necromass C could be used to track the dynamics of SOC storage (Malik et  
72 al., 2016). The cell walls of fungi primarily consist of chitin (a nitrogen-containing  
73 polysaccharide) and  $\beta$ -glucans, whereas bacterial cell walls are mainly composed of  
74 peptidoglycan—a complex of sugars and amino acids (Lenardon et al., 2007). As  
75 bacterial amino sugars is degradable rather than fungal chitin or  $\beta$ -glucans, fungal  
76 necromass existed in soil generally with longer turnover time than bacterial necromass  
77 (Xu et al., 2022). Wang et al. (2021a) reported that the contribution of fungal  
78 necromass carbon (FNC) to SOC exceeded 65%, considerably higher than that of  
79 bacterial necromass carbon (BNC, 32–36%). This pattern is likely attributed to the  
80 slower decomposition rate and stronger mineral-associative capacity of fungal  
81 necromass. Furthermore, greater fungal biomass and higher turnover rates may  
82 enhance the input flux of fungal necromass (Klink et al., 2022). The contributions of  
83 FNC and BNC to SOC depended on the type of ecosystems (Wang et al., 2021a; Cao  
84 et al., 2023; Xu et al., 2024). However, few studies on fungal and bacterial necromass  
85 carbon and their contribution to SOC has been reported for ecosystems under human  
86 interference (Zhou et al., 2023).

87 Terrestrial ecosystems can be broadly categorized into managed (agricultural) and  
88 natural ecosystems (Hobbs et al., 2011; Keith et al., 2022). The agricultural  
89 ecosystems are typical of plant litter derived from single crops under intensive human  
90 management (Bohan et al., 2013), a context that typically leads to bacterial-dominated  
91 soil communities (van Der Heijden et al., 2008). In contrast, natural ecosystems  
92 display greater diversity in plant litter and root deposits (Wu et al., 2019). In such  
93 ecosystems, fungal mycelial networks and stable soil aggregates are enhanced,  
94 leading to higher FNC contributions to SOC (Sanaullah et al., 2020; Sae-Tun et al.,  
95 2022). While bacteria are undoubtedly vital decomposers, fungi play a distinct and  
96 often dominant role in the initial breakdown of complex plant polymers such as  
97 cellulose and lignin. This functional prominence stems from their potent enzymatic  
98 machinery and hyphal growth form, which enable physical penetration and decay of  
99 solid organic matter (de Boer et al., 2005). As key decomposers, fungi are thus critical  
100 in processing cellulose and other complex organic compounds (Hättenschwiler et al.,  
101 2005). Accordingly, as demonstrated by Choi et al. (2018), soil cellulose-degrading  
102 genes are frequently linked to fungal activity and abundance. Rather than implying  
103 higher cellulose concentration per se, diverse plant inputs increase the chemical  
104 heterogeneity of plant-derived polymers (e.g., cellulose, hemicelluloses, and lignin),  
105 which broadens decomposer niches and often favors fungal communities in litter  
106 horizons (Hättenschwiler et al., 2005; Štursová et al., 2012). In contrast, agricultural  
107 monocultures tend to reduce fungal diversity unless mitigated by management  
108 practices (Chen et al., 2020). Reflecting this context dependence, cellulose-rich inputs

109 can enrich saprotrophic fungi in arable soils (Clocchiatti et al., 2021), whereas  
110 bacteria may contribute substantially in mineral soils or under specific microhabitat  
111 and land management conditions (Štursová et al., 2012; Choi et al., 2018). Due to  
112 distinct chemical properties and organo-mineral stabilization pathways, fungal and  
113 bacterial necromass exhibit differing turnover times, making the FNC/BNC ratio a  
114 mechanistic tracer of SOC formation (Angst et al., 2021; Kleber et al., 2021).  
115 Therefore, elucidating the global distribution and drivers of FNC, BNC, and their ratio  
116 across agricultural and natural ecosystems is essential for predicting  
117 management-induced shifts in SOC under varying climatic and soil conditions (Zhang  
118 et al., 2021; Zhou et al., 2023; Xu et al., 2024).

119 In order to explore the global patterns and drivers of FNC, BNC and the  
120 FNC/BNC ratio in agricultural and natural ecosystems, we compiled data from 486  
121 study sites worldwide. The aims of this study were: (1) to quantify the contributions  
122 of FNC and BNC to SOC and the FNC/BNC ratio in agricultural and natural  
123 ecosystems; and (2) to investigate the primary driving factors influencing the  
124 contributions of FNC and BNC to SOC and the FNC/BNC ratio.

125

## 126 **2 Materials and methods**

### 127 2.1 Data collection

128 We compiled a comprehensive dataset following the stepwise workflow. (1) We  
129 collected peer-reviewed papers published from 1996 to 31 December 2022 from Web  
130 of Science (<http://apps.webofknowledge.com>), Google Scholar  
131 (<http://scholar.google.com>), and the China National Knowledge Infrastructure  
132 (<http://cnki.net>), using the keywords: ‘amino sugars’, ‘microbial necromass’,  
133 ‘microbial residue’, ‘fungal residue’, and ‘bacterial residue’. Records from different  
134 databases were merged and deduplicated to form an initial compilation. (2) We then  
135 filtered the compiled studies to include only those focusing on topsoil, defined as the  
136 0–20 cm layer. Studies reporting deeper or unspecified sampling depths (e.g., 0–30  
137 cm) were excluded to ensure spatial comparability. (3) Full texts were assessed to  
138 confirm the presence of paired fungal and bacterial residue data from the same  
139 sample—specifically, glucosamine (GluN) and muramic acid (MurA), or directly  
140 reported FNC and BNC values—to enable consistent cross-study calculation of the  
141 FNC/BNC ratio. Studies lacking either biomarker were excluded from ratio analyses,  
142 though those directly reporting the FNC/BNC ratio were retained. (4) Eligible  
143 observations were classified into agricultural ecosystems (including dry land, irrigated  
144 cropland, and submerged paddy) or natural ecosystems (forest and grassland) based  
145 on study metadata. (5) For natural ecosystems, data from fertilized, polluted,  
146 experimentally treated, or otherwise anthropogenically disturbed sites were excluded.  
147 In total, the final dataset consisted of 2094 observations from 486 sites worldwide  
148 (145 agricultural and 341 natural sites; Figure 1) reported in 164 peer-reviewed papers.  
149 Of these observations, 1001 were from agricultural ecosystems, and 1093 from natural  
150 ecosystems. Among the 341 natural sites, 195 were forests and 146 were grasslands.  
151 For agricultural sites, we used Google Earth Engine with the LGRIP30 V1 dataset to  
152 classify agricultural ecosystem into dry land and irrigated cropland, and we overlaid

153 the JRC surface-water seasonality layer to extract submerged paddy from the irrigated  
154 class (LGRIP30 irrigated value = 2 and JRC seasonality  $\geq 1$ ). We ultimately classified  
155 145 samples of agricultural ecosystems into 32 dry land, 72 irrigated, and 41  
156 submerged paddy sites.

157 We calculated the FNC and BNC based on amino sugar concentrations following  
158 widely used conversion factors, correcting total GluN for its bacterial share using  
159 MurA:

$$160 \quad FNC = \left( \frac{GluN}{179.17} - 2 \times \frac{MurA}{251.23} \right) \times 179.17 \times 9 \quad \text{Equation 1}$$

161 where 9 (unitless) is the conversion factor from GluN to FNC. To estimate  
162 fungal-derived GluN, we subtracted the bacterial share of GluN assuming an  
163 empirical GluN:MurA molar ratio of 2:1 for bacterial residues. 179.17 and 251.23 are  
164 the molecular weights of GluN and MurA, respectively. And their units are all g/mol.  
165 The unit of FNC is mg/kg.

$$166 \quad BNC = MurA \times 45 \quad \text{Equation 2}$$

167 where 45 (unitless) is the conversion factor from MurA to BNC. The unit of BNC  
168 is mg/kg.

169 Additional information including site geographic location (latitude and longitude),  
170 topographical condition (elevation), climatic factors (MAT) and mean annual  
171 precipitation [MAP]), soil physicochemical properties (pH, SOC, TN, clay content,  
172 and soil temperature), and biotic (microbial and plant) factors were recorded.  
173 Specifically, biotic factors included microbial biomass carbon (MBC), microbial  
174 biomass nitrogen (MBN), MBC/MBN, net primary production (NPP), and  
175 belowground biomass C density (BGBC). The data of topographical condition  
176 (elevation) was classified as geographical factor in this study. When MAT and MAP  
177 were unavailable in the original articles, we extracted them from the global climate  
178 layers of WorldClim (<http://www.worldclim.org/>) with a grid precision of  $30 \times 30$  arc  
179 sec according to geographic location. Missing elevation data were extracted using the  
180 *elevatr* package v.0.4.2 (Hollister, 2021) in the R environment. We acquired the data  
181 on annual mean soil temperature from the study of Lembrechts et al. (2022), while  
182 other absent soil physicochemical data were extracted from the Harmonized World  
183 Soil Database  
184 (<https://www.fao.org/soils-portal/data-hub/soil-maps-and-databases/harmonized-world-soil-database-v12/en/>)  
185 and SoilGrids 2.0 (Poggio et al., 2021;  
186 <https://www.soilgrids.org/>) using ArcGIS 10.3. We supplemented missing climatic and  
187 soil variables using high-resolution, globally interpolated datasets to ensure consistent  
188 spatial coverage across all sites. After retrieving missing value from gridded data, we  
189 typically calibrate them against field-reported values via a field-anchored bias  
190 correction (i.e., a site- or region-specific “delta” adjustment) to minimize errors  
191 introduced by gridded data. While the use of such data introduces inherent  
192 uncertainties, these databases are widely adopted in global-scale ecological analyses  
193 and provide the most feasible approach for a unified assessment. In addition, the data  
194 on NPP and BGBC were acquired from the studies of Zhao and Running (2010) and  
195 Spawn et al. (2020), respectively. Missing MBC and MBN data were acquired using a

196 global database with a high resolution of  $30 \times 30$  arc sec (Wang et al., 2022).

197

## 198 2.2 Statistical analysis

199 All the statistical analyses were performed using R v4.1.3 (R Core Team, 2021).  
200 Initially, the Shapiro–Wilk test was employed to assess the normality of our data,  
201 followed by the application of Levene's test to evaluate the homogeneity of variances  
202 across different groups. To detect the significant differences in the contributions of  
203 FNC and BNC to SOC, and the FNC/BNC ratio between agricultural and natural  
204 ecosystems, as well as between forest and grassland ecosystems, the Wilcoxon rank  
205 sum test was conducted. Kruskal–Wallis and Dunn's post hoc tests were used to  
206 assess the significant differences of the contributions of FNC and BNC to SOC, and  
207 the FNC/BNC ratio among dry land, irrigated cropland, and submerged paddy. We  
208 used Spearman's rank correlation coefficient to explore the connections between the  
209 16 variables considered in this study, including geographical and climatic factors, soil  
210 physicochemical properties, and biotic factors. Since there was a strong positive  
211 correlation between MAT and soil temperature (Figure S1), soil temperature was  
212 excluded from our subsequent analyses. Linear regressions between different factors  
213 and the contributions of FNC and BNC to SOC and the FNC/BNC ratio were  
214 performed. Dots and smoothing curves were drawn using the *geom\_point* and  
215 *geom\_smooth* functions, respectively, in the *ggplot2* package v.3.4.0 (Wickham,  
216 2016).

217 Variation partitioning analysis was conducted using the *vegan* package v.2.5.7  
218 (Oksanen et al., 2020) to evaluate the effects of four types of factors on the  
219 contributions of FNC and BNC to SOC and the FNC/BNC ratio in agricultural and  
220 natural ecosystems at global scale. We used a variance inflation factor threshold of 3.3  
221 to eliminate those variables that were strongly correlated and avoid multicollinearity  
222 (Figure S2; Kock, 2015; Fanin et al., 2020). Following factor selection, boosted  
223 regression trees (BRTs) were used to partition independent influences of geographical  
224 (elevation) and climatic (MAT and MAP) factors, soil physicochemical properties (pH,  
225 clay, C/N, and SOC), and biotic factors (NPP, BGBC, MBC, and MBC/MBN) on the  
226 contributions of FNC and BNC to SOC and the FNC/BNC ratio with the *gbm* package  
227 v.2.1.8.1 (Greenwell et al., 2022).

228 Utilizing the selected factors, we performed structural equation models (SEMs)  
229 to quantify the effects (direct, indirect and both) of four types of factors on the  
230 contributions of FNC and BNC to SOC and the FNC/BNC ratio using *lavaan* package  
231 v.0.6.19 (Rosseel, 2012). According to the previously reported potential causal  
232 relationships between explanatory and response variables (Wang et al., 2021a, 2021b;  
233 Li et al., 2024), we established the *priori* structural equation models for agricultural  
234 and natural ecosystems, respectively (Figure S3). The SEMs were fitted via maximum  
235 likelihood estimation, with non-significant paths iteratively pruned through stepwise  
236 exclusion, followed by model evaluation using modification indices and  
237 goodness-of-fit criteria. The fit indices included degrees of freedom (df), chi-square  
238 ( $\chi^2$ ,  $0 \leq \chi^2/\text{df} \leq 2$ ), comparative fit index (CFI > 0.9), and root mean square error of  
239 approximation (RMSEA < 0.08), which were used to assess the adequacy of the SEM.

240 Map, box, bar, bubble, and lollipop charts were plotted with the *ggplot2* package  
241 v.3.4.0 (Wickham, 2016). To enhance map visualization, the *ggnewscale* package  
242 v.0.4.8 (Campitelli, 2022) was necessary alongside the *ggplot2* package v.3.4.0  
243 (Wickham, 2016). Similarly, the *ggpubr* package v.0.5.0 (Kassambara, 2022) was an  
244 additional necessity when creating lollipop charts.

245

### 246 **3 Results**

#### 247 3.1 Fungal and bacterial necromass contribution to SOC in agricultural and natural 248 ecosystems

249 Our analysis revealed statistically significant disparities in the contributions of FNC  
250 and BNC to SOC in agricultural and natural ecosystems at the global scale ( $P < 0.05$ ;  
251 Figure 2a, b). Notably, the average contributions of FNC and BNC to SOC were  
252 substantially higher in agricultural ecosystems than in natural ecosystems ( $P < 0.001$ ;  
253 Figures 2a, b). For FNC, the average contribution was 34.39% in agricultural  
254 ecosystems, versus 29.24% in natural ecosystems. BNC contributed an average of  
255 15.65% to SOC in agricultural ecosystems, compared to 14.02% in natural  
256 ecosystems (Table 1). Our results also indicated that the contributions of FNC to SOC  
257 were approximately twice those of BNC in agricultural and natural ecosystems (Table  
258 1).

259 The contributions of FNC and BNC to SOC indicated no significant difference  
260 between dry land and irrigated cropland ( $P > 0.05$ ), whereas both differed  
261 significantly from submerged paddy ( $P < 0.05$ ; Figure S4a, b). In detail, across dry  
262 land, irrigated cropland, and submerged paddy, the mean contributions of FNC to  
263 SOC were 37.77%, 35.35%, and 22.82%, respectively, whereas those of BNC were  
264 17.34%, 15.95%, and 10.55% (Table 1). Moreover, there were no significant  
265 differences in the contributions of FNC and BNC to SOC between forest and  
266 grassland ecosystems ( $P > 0.05$ ; Figure S5). Specifically, FNC contributed, on  
267 average, 29.11% to SOC in forests and 26.75% in grasslands, while BNC contributed  
268 13.48% in forests and 14.34% in grasslands (Table 1).

269

#### 270 3.2 Ratios of fungal and bacterial necromass in agricultural and natural ecosystems

271 Our results indicated that, at the global scale, the soil FNC/BNC ratio differs  
272 significantly between agricultural and natural ecosystems ( $P < 0.05$ ; Fig. 2c), with a  
273 higher ratio in natural ecosystems (3.22) than in agricultural ecosystems (2.61; Table  
274 1). The FNC/BNC ratio did not differ significantly among dry land, irrigated cropland,  
275 and submerged paddy ( $P > 0.05$ ; Figure S4c), with average FNC/BNC ratios of 2.87,  
276 2.51, and 2.62, respectively (Table 1). Similarly, there was no significant difference in  
277 the FNC/BNC ratio between forest and grassland ecosystems ( $P > 0.05$ ; Figure S5),  
278 and the average FNC/BNC ratios for forests and grasslands were 2.80 and 3.58 (Table  
279 1), respectively.

280

#### 281 3.3 Associations of abiotic and biotic factors with microbial necromass parameters

282 Soil physicochemical factors were the most important influence on the contributions  
283 of FNC and BNC to SOC across both ecosystem types (Figures 3a–d, 4a–d).

284 Specifically, they explained 16% and 17% of the variance in the contributions of FNC  
285 and BNC to SOC in agricultural ecosystems, respectively (Figures 3a, c), and 20%  
286 and 24% in natural ecosystems (Figures 3b, d). BRTs corroborated this pattern, with  
287 soil physicochemical factors showing the highest relative influence (51% for FNC,  
288 and 44% for BNC) in agricultural systems and 44% in natural systems (Figures 4a–d).  
289 All BRT models were significant ( $P < 0.001$ ), with explained variance 36–66%. While  
290 soil factors dominated overall, responses to individual variables differed between  
291 ecosystems. In detail, in agricultural systems, the C/N ratio ranked third for FNC after  
292 clay and SOC (Figure 4a), whereas C/N was the top predictor for FNC in natural  
293 systems and for BNC in both ecosystems (Figures 4b–d). Consistently, linear models  
294 showed declines in the contributions of FNC and BNC with increasing C/N in both  
295 ecosystems (Figures S6g, S7g). SEMs yielded convergent results, indicating both  
296 direct and indirect pathways (Figures 5a–d, 6a–d). Notably, the direct and total effects  
297 of soil physicochemical factors on FNC were negative in agricultural but positive in  
298 natural ecosystems (Figures 5a, b, 6a, b), whereas the effects on BNC were negative  
299 in both ecosystem types (Figures 5c, d, 6c, d).

300 Our results indicated that geographical factors were the most important  
301 contributors to explain the FNC/BNC ratio in both agricultural and natural ecosystems,  
302 accounting for 21% and 10% of the explained variance in the FNC/BNC ratio,  
303 respectively (Figures 3e, f). The results of the BRTs suggested that geographical  
304 factors played a similar role in explaining the FNC/BNC ratio (Figures 4e, f). In the  
305 BRT models, geographical factors emerged as the primary influencers of the  
306 FNC/BNC ratio in agricultural and natural ecosystems, accounting for 32% and 44%  
307 of the variance in each case, respectively (Figures 4e, f). To be more specific,  
308 elevation was the most significant geographical factors influencing the FNC/BNC  
309 ratio in both ecosystems (Figures 4e, f). Moreover, the FNC/BNC ratio in agricultural  
310 and natural ecosystems show significantly increased with an increase elevation  
311 (Figure S8a). The results of SEMs also indicated that geographical factors were the  
312 most influential factors for the FNC/BNC ratio in agricultural and natural ecosystems,  
313 exerting both direct and indirect effects on this ratio (Figures 5e, 6e), with the  
314 standardized total effect being positive (Figures 5f, 6f).

315

## 316 **4 Discussion**

### 317 **4.1 Fungal necromass contributes two times more to SOC than bacterial necromass**

318 Our results show that in agricultural ecosystems, FNC/SOC ranged from 0.09% to  
319 97.53% (mean  $\pm$  SE:  $34.39 \pm 0.67\%$ ), and BNC/SOC ranged from 0.81% to 65%  
320 ( $15.65 \pm 0.33\%$ ). In natural ecosystems, FNC/SOC ranged from 0.92% to 96.29%  
321 ( $29.24 \pm 0.51\%$ ), and BNC/SOC ranged from 0.25% to 89.45% ( $14.02 \pm 0.36\%$ )  
322 (Table 1). The FNC/BNC ratio ranged from 0.02 to 12.74 ( $2.61 \pm 0.06$ ) in agricultural  
323 ecosystems and from 0.12 to 44.24 ( $3.22 \pm 0.11$ ) in natural ecosystems (Table 1).  
324 Despite substantial variability at the individual sample level, the mean contribution of  
325 FNC was approximately twice that of BNC in both ecosystem types. Moreover, the  
326 mean FNC/BNC ratio was significantly higher in natural ecosystems than in  
327 agricultural ecosystems ( $P < 0.05$ ; Figure 2). Although this general pattern has been

328 reported in previous studies (Liang et al., 2019; Wang et al., 2021a; Zhang et al., 2023;  
329 Ding et al., 2024), the systematic differences in the magnitude of these contributions  
330 between agricultural and natural ecosystems—and their underlying drivers—have  
331 remained poorly understood. Our study not only confirms the broad pattern but also  
332 elucidates these ecosystem-level disparities and their environmental determinants.  
333 Consistent with our finding that the contribution of fungal necromass carbon (FNC) to  
334 SOC exceeded that of bacterial necromass carbon (BNC) in both ecosystem types  
335 (Table 1), the predominance of fungal necromass may be attributed to its more  
336 recalcitrant cell wall composition (e.g., chitin) and slower decomposition rate (Wang  
337 et al., 2021a). Our BRT and SEM analyses further identified soil clay content and C/N  
338 ratio as key drivers of FNC accumulation (Figs. 4a, 5a), reinforcing the importance of  
339 organo-mineral associations in the stabilization of fungal-derived carbon.

340 Additionally, our study reveals previously unreported disparities between  
341 ecosystem types, for example, the contributions of both fungal and bacterial  
342 necromass carbon (FNC and BNC) to SOC were significantly higher in agricultural  
343 ecosystems, while the FNC/BNC ratio was substantially elevated in natural  
344 ecosystems. The higher contributions of FNC and BNC to SOC in agricultural  
345 ecosystems may be attributable to two main factors. First, natural ecosystems  
346 typically receive larger and more heterogeneous plant-derived carbon inputs than  
347 agricultural systems. These inputs expand the plant-derived SOC pool and can dilute  
348 the relative contribution of microbial necromass to SOC, thereby resulting in a lower  
349 perceived contribution of microbial necromass in natural ecosystems (Angst et al.,  
350 2021; Kleber et al., 2021). Second, the significantly lower soil C/N ratio in  
351 agricultural ecosystems (10.78) compared to natural ecosystems (27.44) reflects  
352 relative nitrogen enrichment, largely resulting from anthropogenic fertilization  
353 (Castellano et al., 2015; Chen et al., 2020). This nitrogen-rich environment can  
354 enhance microbial carbon use efficiency and alleviate nutrient limitation, thereby  
355 promoting the production and accumulation of microbial necromass (Liang et al.,  
356 2017). Supporting this mechanism, we found that the contributions of both FNC and  
357 BNC to SOC decreased significantly with increasing soil C/N ratio in both  
358 agricultural ecosystems (FNC/SOC:  $R = -0.27$ ,  $P < 0.001$ ; BNC/SOC:  $R = -0.29$ ,  $P <$   
359  $0.001$ ) and natural ecosystems (FNC/SOC:  $R = -0.17$ ,  $P < 0.001$ ; BNC/SOC:  $R =$   
360  $-0.35$ ,  $P < 0.001$ ; Figures S6g, S7g). These results further underscore that a lower soil  
361 C/N ratio—often indicative of higher nitrogen availability—is a key driver of  
362 microbial necromass accumulation. It should be noted that although in situ plant  
363 residues in agricultural systems (e.g., cereal straw) may have high C/N ratios, the  
364 overall soil C/N ratio is reduced by management practices such as mineral fertilization  
365 and the incorporation of low C/N organic amendments.

366 Furthermore, nutrient-rich conditions prevalent in agricultural systems (e.g., due  
367 to fertilization) often select for bacterial-dominated communities, as many bacteria  
368 exhibit *r*-strategist traits that support rapid growth under high resource availability. In  
369 contrast, natural ecosystems—characterized by lower nutrient availability and greater  
370 resource heterogeneity—tend to favor fungal dominance, since fungi often function as  
371 *K*-strategists with higher efficiency in decomposing complex organic matter under

372 resource-limited conditions (Strickland & Rousk, 2010; Yu et al., 2022). This shift in  
373 microbial community composition is observed in our results, which show a  
374 significantly higher FNC/BNC ratio in natural ecosystems across our global dataset  
375 (Figure 2c, Table 1). A high FNC/BNC ratio signifies a fungal-dominated  
376 decomposition pathway. Fungal necromass—rich in recalcitrant compounds such as  
377 chitin—is more resistant to decay, and fungal hyphae play a key role in the formation  
378 of stable soil aggregates that physically protect organic matter from degradation  
379 (Lenardon et al., 2007). This pathway promotes the formation of stable, long-turnover  
380 SOC pools essential for long-term carbon sequestration (Six et al., 2006; Lehmann et  
381 al., 2020). Furthermore, fungi generally exhibit higher carbon use efficiency than  
382 bacteria, meaning a larger proportion of assimilated carbon is allocated to biomass  
383 production (and subsequently necromass) rather than being respired as CO<sub>2</sub> (Wang &  
384 Kuzyakov, 2024). Thus, the fungal-driven pathway characteristic of natural  
385 ecosystems represents a highly efficient conversion of plant litter into persistent soil  
386 organic matter (Kallenbach et al., 2016; Malik et al., 2016). Conversely, the lower  
387 FNC/BNC ratio observed in agricultural ecosystems reflects a bacterial-dominated  
388 pathway, accelerated by practices such as tillage and nutrient amendments. This  
389 pathway is associated with faster carbon cycling and greater carbon loss through  
390 respiration. Although microbial necromass can accumulate under these  
391 conditions—sometimes contributing more significantly to a reduced total SOC  
392 pool—the resulting carbon is often less stabilized (Zhou et al., 2023). Therefore, the  
393 FNC/BNC ratio serves not merely as a descriptive metric, but as a functional  
394 biomarker that elucidates fundamental differences in the stability and persistence of  
395 SOM between managed agricultural systems and natural ecosystems.

396 Notably, as major components of agricultural ecosystems, both dryland and  
397 irrigated croplands exhibited significantly greater contributions of FNC and BNC to  
398 SOC than submerged paddy soils, although the FNC/BNC ratio did not differ  
399 significantly among these three systems (Figure S4). This pattern may reflect similar  
400 aeration regimes in dryland and irrigated systems (predominantly oxygenated),  
401 leading to comparable decomposition–transformation–mineral association pathways  
402 and, thus, similar net contributions of fungal and bacterial residues to SOC  
403 (Ghezzehei et al., 2019). By contrast, persistent or periodic flooding in paddy soils  
404 induces anoxia, suppresses aerobic decomposition, and shifts metabolic pathways  
405 (e.g., denitrification and methanogenesis), potentially suppressing fungal activity or  
406 dominance and altering the relative accumulation and turnover of fungal and bacterial  
407 necromass (Qiu et al., 2017), resulting in contributions that differ significantly  
408 from—and are lower than—those in the other two systems. Flooding can suppress  
409 fungi yet also enhance the joint retention of both fungal and bacterial necromass via  
410 slower decomposition and mineral protection, yielding unchanged ratios but altered  
411 totals or compositional pathways (Chen et al., 2021; Gao et al., 2024).

412

413 4.2 Driving factors of the change in fungal and bacterial necromass contribution to  
414 SOC and their ratio

415 Deng and Liang (2022) suggested that the potential contribution of microbial

416 necromass to the SOC pool was governed by the C/N ratio. This finding was  
417 confirmed by our results (Figures 4b–d). As elaborated in *Section 4.1*, high N  
418 availability (i.e., low soil C/N ratio) promotes the production and accumulation of  
419 microbial necromass (Wu et al., 2025). Consequently, the contributions of both FNC  
420 and BNC to SOC decreased with increasing soil C/N ratio (Figures S6g, S7g). In  
421 agricultural ecosystems, high soil N levels primarily result from fertilization (Chen et  
422 al., 2020). In contrast, natural ecosystems experience minimal anthropogenic  
423 disturbance, N often acts as the key limiting factor for microbial activity (Elser et al.,  
424 2007). Under N-limited conditions, microbes (both fungi and bacteria) allocate more  
425 energy and C resources to the synthesis of N-acquiring enzymes (e.g., proteases and  
426 chitinases). This shift in metabolic strategy reduces the C allocated to biomass  
427 synthesis, thereby diminishing the amount of C ultimately converted into microbial  
428 necromass (Mooshammer et al., 2014; Liu et al., 2024). Thus, although microbial  
429 community composition differs between natural and agricultural ecosystems, the  
430 regulatory role of soil C/N ratio in shaping their structure and function remains  
431 consistent (Han et al., 2024). In our study, soil clay content was identified as the  
432 predominant factor governing the contribution of FNC to SOC in agricultural  
433 ecosystems (Figure 4a), with this contribution increasing concomitantly with clay  
434 content (Figure S6d). This suggests that soils with higher clay and silt contents  
435 generally accumulate greater amounts of microbial residues, particularly those derived  
436 from fungi, which can be attributed to the promotion of stable organo-mineral  
437 complex formation by abundant fine soil particles (Six et al., 2006 and Liang et al.,  
438 2017). Furthermore, although agricultural management practices often disturb soil  
439 structure, they simultaneously enhance clay enrichment and aggregate formation,  
440 thereby providing effective physical protection for the long-term stabilization of  
441 fungal-derived C (Chen et al., 2020; Mou et al., 2021; Zhou et al., 2023).

442 On the contrary, geographical factor (elevation) was identified as the most  
443 influential predictor of the FNC/BNC ratio in both agricultural and natural ecosystems  
444 (Figures 4e, f, 5f, 6f), with the ratio increasing significantly with elevation (Figure  
445 S8a). Increasing elevation typically leads to decreased temperature, and increased  
446 precipitation (Körner, 2007), conditions favoring fungi over bacteria due to higher  
447 enzymatic capabilities and resource-use efficiency of fungi under the environments  
448 (Chen et al., 2020; Yu et al., 2022; Zhang et al., 2025). High elevation also results in  
449 slower soil development, which can reduce the availability of soil nutrients  
450 (Guerrero-Ramírez et al., 2020). This in turn increases environmental stress and  
451 restricts bacterial activity, thereby favoring the accumulation and conversion of fungal  
452 residues into necromass (Li et al., 2024). Our study further demonstrated that although  
453 elevation had a direct effect on the FNC/BNC ratio, it also indirectly influenced the  
454 ratio by modulating climatic factors, soil physicochemical properties, and biological  
455 factors (Figures 5e, 6e). This may explain why elevation is always integrate other  
456 environmental factor effects in the studies of MNC (Cui et al., 2023; Zhang et al.,  
457 2025).

458  
459 4.3 Limitations and uncertainties

460 Although the present study provides important insights on global patterns and drivers  
461 of soil microbial necromass in agricultural and natural ecosystems, we must clarify  
462 two limitations. First, the limited data available on microbial characteristics, such as  
463 microbial community composition, enzymatic activities, and the content of soil  
464 aggregates and minerals hinder exploration of the drivers of soil microbial necromass.  
465 Second, it is undeniable that our dataset is unevenly distributed, primarily  
466 concentrating on the Northern Hemisphere, with sparse or nearly no data from other  
467 regions such as Africa, South America, and Australia (Figure 1). Additionally, the  
468 natural ecosystems in this study were limited to forests and grasslands, excluding  
469 other natural habitats such as wetlands and deserts. The uneven distribution of data  
470 may reduce the universality of MNC as a key driver of soil carbon pools in global  
471 terrestrial ecosystems. Furthermore, the compiled studies employed varied  
472 methodologies regarding sampling time, depth, and laboratory protocols. While such  
473 heterogeneity is an inherent challenge in global meta-analyses, it likely introduces  
474 additional variability and may constrain the direct comparability of certain data points.  
475 Therefore, more standardized data from these important areas and biomes are clearly  
476 required, and further investigation is warranted to fill the data gaps regarding the  
477 contribution of MNC to SOC in terrestrial ecosystems.

478

## 479 **5 Data availability**

480 The data and R code for this manuscript are available at  
481 <https://doi.org/10.6084/m9.figshare.28827383> (Lu, 2025).

482

## 483 **6 Conclusions**

484 Our results indicate that, on average, fungal necromass carbon (FNC) contributes  
485 approximately twice as much to soil organic carbon (SOC) as bacterial necromass  
486 carbon (BNC) in both agricultural and natural ecosystems. The relative contributions  
487 of FNC and BNC to SOC were found to be higher in agricultural ecosystems—an  
488 effect that is mediated by differences in soil physicochemical factors. The FNC/BNC  
489 ratio was significantly higher in natural ecosystems than in agricultural ecosystems,  
490 albeit with a modest effect size, and was primarily driven by geographical  
491 factors—particularly elevation. Our findings demonstrate that, despite considerable  
492 variability among individual sampling sites, statistically significant differences exist  
493 between agricultural and natural ecosystems in the contributions of fungal and  
494 bacterial necromass carbon (FNC and BNC) to soil organic carbon (SOC), as well as  
495 in the FNC/BNC ratio, at a global scale. These results underscore a potential  
496 fundamental divergence in the pathways and mechanisms of carbon turnover and  
497 stabilization between these two broad ecosystem types. These insights provide novel  
498 evidence that ecosystem management type (agricultural versus natural) is a key  
499 determinant of the pathways through which microbial necromass contributes to the  
500 global soil organic carbon (SOC) pool. Future studies that integrate microbial  
501 community composition with necromass dynamics across a broader range of biomes  
502 will be essential to predict ecosystem-specific responses of this critical carbon pool to  
503 global change.

504

505 **Author contributions**

506 JL performed the data analysis and prepared the original draft. TC and MDB  
507 contributed to manuscript review and editing. WL and HS contributed to data  
508 collection. YJ contributed to data analysis. ZW supervised the project and contributed  
509 to the original draft.

510

511 **Competing interests**

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

513

514 **Disclaimer**

515 Publisher's note: Copernicus Publications remains neutral with regard to jurisdictional  
516 claims in published figures and institutional affiliations.

517

518 **Acknowledgements**

519 We are grateful for the data contributors and the scientific community which made the  
520 data accessible and useful for our study.

521

522 **Financial support**

523 This work was supported financially by the National Natural Science Foundation of  
524 China (No. 32160291), the National Key Research and Development Program of  
525 China (No. 2021YFD2200403-04), the Natural Science Foundation of Hainan  
526 province (No. 423QN212), and the Hainan University Research start-up Fund (No.  
527 KYQD(ZR)22187).

528

529 **References**

530 Anderson, T. H., and Domsch, K. H.: Ratios of microbial biomass carbon to total  
531 organic carbon in arable soils, *Soil Biol. Biochem.*, 21, 471–479,  
532 [https://doi.org/10.1016/0038-0717\(89\)90117-X](https://doi.org/10.1016/0038-0717(89)90117-X), 1989.

533 Angst, G., Mueller, K. E., Nierop, K. G., and Simpson, M. J.: Plant-or  
534 microbial-derived? A review on the molecular composition of stabilized soil  
535 organic matter, *Soil Biol. Biochem.*, 156, 108189,  
536 <https://doi.org/10.1016/j.soilbio.2021.108189>, 2021.

537 Bellamy, P. H., Loveland, P. J., Bradley, R. I., Lark, R. M., and Kirk, G. J.: Carbon  
538 losses from all soils across England and Wales 1978–2003, *Nature*, 437, 245–248,  
539 <https://doi.org/10.1038/nature04038>, 2005.

540 Bohan, D. A., Raybould, A., Mulder, C., Woodward, G., Tamaddoni-Nezhad, A.,  
541 Bluthgen, N., Pocock, M. J. O., Muggleton, S., Evans, D. M., Astegiano, J.,  
542 Massol, F., Loeuille, N., Petit, S., and Macfadyen, S.: Networking agroecology:  
543 integrating the diversity of agroecosystem interactions, *Adv. Ecol. Res.*, 49, 1–67,  
544 <https://doi.org/10.1016/B978-0-12-420002-9.00001-9>, 2013.

545 Campitelli, E.: *ggnewscale*: Multiple Fill and Colour Scales in 'ggplot2', R package  
546 version 0.4.8., <https://CRAN.R-project.org/package=ggnewscale>, 2022.

547 Cao, Y., Ding, J., Li, J., Xin, Z., Ren, S., and Wang, T.: Necromass-derived soil  
548 organic carbon and its drivers at the global scale, *Soil Biol. Biochem.*, 181,  
549 109025, <https://doi.org/10.1016/j.soilbio.2023.109025>, 2023.

550 Castellano, M. J., Mueller, K. E., Olk, D. C., Sawyer, J. E., and Six, J.: Integrating  
551 plant litter quality, soil organic matter stabilization, and the carbon saturation  
552 concept, *Global Change Biol.*, 21, 3200–3209, <https://doi.org/10.1111/gcb.12982>,  
553 2015.

554 Chen, G., Ma, S., Tian, D., Xiao, W., Jiang, L., Xing, A., Zou, A., Zhou, L., Shen, H.,  
555 Zheng, C., Ji, C., He, H., Zhu, B., Liu, L., and Fang, J.: Patterns and  
556 determinants of soil microbial residues from tropical to boreal forests, *Soil Biol.*  
557 *Biochem.*, 151, 108059, <https://doi.org/10.1016/j.soilbio.2020.108059>, 2020.

558 Chen, X., Hu, Y., Xia, Y., Zheng, S., Ma, C., Rui, Y., He, H., Huang, D., Zhang, Z., Ge,  
559 T., Wu, J., Guggenberger, G., Kuzyakov, Y., and Su, Y.: Contrasting pathways of  
560 carbon sequestration in paddy and upland soils, *Global Change Biol.*, 27, 2478–  
561 2490, <https://doi.org/10.1111/gcb.15595>, 2021.

562 Choi, J., Bach, E., Lee, J., Flater, J., Dooley, S., Howe, A., and Hofmockel, K. S.:  
563 Spatial structuring of cellulase gene abundance and activity in soil, *Front.*  
564 *Environ. Sci.*, 6, 107, <https://doi.org/10.3389/fenvs.2018.00107>, 2018.

565 Clocchiatti, A., Hannula, S. E., Hundscheid, M. P., Klein Gunnewiek, P. J., and de  
566 Boer, W.: Stimulated saprotrophic fungi in arable soil extend their activity to the  
567 rhizosphere and root microbiomes of crop seedlings, *Environ. Microbiol.*, 23,  
568 6056–6073, <https://doi.org/10.1111/1462-2920.15563>, 2021.

569 Cotrufo, M. F., Wallenstein, M. D., Boot, C. M., Deneff, K., and Paul, E.: The  
570 Microbial Efficiency-Matrix Stabilization (MEMS) framework integrates plant  
571 litter decomposition with soil organic matter stabilization: do labile plant inputs  
572 form stable soil organic matter?, *Global Change Biol.*, 19, 988–995,  
573 <https://doi.org/10.1111/gcb.12113>, 2013.

574 Crowther, T. W., Sokol, N. W., Oldfield, E. E., Maynard, D. S., Thomas, S. M., and  
575 Bradford, M. A.: Environmental stress response limits microbial necromass  
576 contributions to soil organic carbon, *Soil Biol. Biochem.*, 85, 153–161,  
577 <https://doi.org/10.1016/j.soilbio.2015.03.002>, 2015.

578 Cui, W., Li, R., Fan, Z., Wu, L., Zhao, X., Wei, G., and Shu, D.: Weak environmental  
579 adaptation of rare phylotypes sustaining soil multi-element cycles in response to  
580 decades-long fertilization, *STOTEN.*, 871, 162063,  
581 <https://doi.org/10.1016/j.scitotenv.2023.162063>, 2023.

582 de Boer, W. D., Folman, L. B., Summerbell, R. C., and Boddy, L.: Living in a fungal  
583 world: impact of fungi on soil bacterial niche development, *FEMS Microbiol.*  
584 *Rev.*, 29, 795–811, <https://doi.org/10.1016/j.femsre.2004.11.005>, 2005.

585 Deng, F., and Liang, C.: Revisiting the quantitative contribution of microbial  
586 necromass to soil carbon pool: stoichiometric control by microbes and soil, *Soil*  
587 *Biol. Biochem.*, 165, 108486, <https://doi.org/10.1016/j.soilbio.2021.108486>,  
588 2022.

589 Ding, Z., Mou, Z., Li, Y., Liang, C., Xie, Z., Wang, J., Hui, D., Lambers, H., Sardans,  
590 J., Peñuelas, J., Xu, H., and Liu, Z.: Spatial variation and controls of soil

591 microbial necromass carbon in a tropical montane rainforest, *STOTEN.*, 921,  
592 170986, <https://doi.org/10.1016/j.scitotenv.2024.170986>, 2024.

593 Elser, J. J., Bracken, M. E., Cleland, E. E., Gruner, D. S., Harpole, W. S., Hillebrand,  
594 H., Ngai, J. T., Seabloom, E. W., Shurin, J. B., and Smith, J. E.: Global analysis  
595 of nitrogen and phosphorus limitation of primary producers in freshwater, marine  
596 and terrestrial ecosystems, *Ecol. Lett.*, 10, 1135–1142,  
597 <https://doi.org/10.1111/j.1461-0248.2007.01113.x>, 2007.

598 Fanin, N., Bezaud, S., Sarneel, J. M., Cecchini, S., Nicolas, M., and Augusto, L.:  
599 Relative importance of climate, soil and plant functional traits during the early  
600 decomposition stage of standardized litter, *Ecosystems*, 23, 1004–1018,  
601 <https://doi.org/10.1007/s10021-019-00452-z>, 2020.

602 Gao, W., Duan, X., Chen, X., Wei, L., Wang, S., Wu, J., and Zhu, Z.: Iron-carbon  
603 complex types and bonding forms jointly control organic carbon mineralization  
604 in paddy soils, *STOTEN.*, 953, 176117,  
605 <https://doi.org/10.1016/j.scitotenv.2024.176117>, 2024.

606 Ghezzehei, T. A., Sulman, B., Arnold, C. L., Bogie, N. A., and Berhe, A. A.: On the  
607 role of soil water retention characteristic on aerobic microbial respiration,  
608 *BIOGEOSCIENCES.*, 16, 1187–1209, <https://doi.org/10.5194/bg-16-1187-2019>,  
609 2019.

610 Greenwell, B., Boehmke, B., Cunningham, J., and Developers, G. B. M.: *gbm*:  
611 Generalized Boosted Regression Models, R package version 2.1.8.1.,  
612 <https://CRAN.R-project.org/package=gbm>, 2022.

613 Han, B., Yao, Y., Wang, Y., Su, X., Ma, L., Chen, X., and Li, Z.: Microbial traits  
614 dictate soil necromass accumulation coefficient: A global synthesis, *Global Ecol.*  
615 *Biogeogr.*, 33, 151–161, <https://doi.org/10.1111/geb.13776>, 2024.

616 Hao, Z., Zhao, Y., Wang, X., Wu, J., Jiang, S., Xiao, J., Wang, K., Zhou, X., Liu, H., Li,  
617 J., and Sun, Y.: Thresholds in aridity and soil carbon-to-nitrogen ratio govern the  
618 accumulation of soil microbial residues, *Commun. Earth Environ.*, 2, 236,  
619 <https://doi.org/10.1038/s43247-021-00306-4>, 2021.

620 Hättenschwiler, S., Tiunov, A. V., and Scheu, S.: Biodiversity and litter decomposition  
621 in terrestrial ecosystems, *Annu. Rev. Ecol. Evol. Syst.*, 36, 191–218,  
622 <https://doi.org/10.1146/annurev.ecolsys.36.112904.151932>, 2005.

623 Hobbs, R. J., Hallett, L. M., Ehrlich, P. R., and Mooney, H. A.: Intervention ecology:  
624 applying ecological science in the twenty-first century, *BioScience*, 61, 442–450,  
625 <https://doi.org/10.1525/bio.2011.61.6.6>, 2011.

626 Hollister, J. W.: *elevatr*: Access Elevation Data from Various APIs, R package version  
627 0.4.2., <https://CRAN.R-project.org/package=elevatr/>, 2021.

628 Kallenbach, C. M., Frey, S. D., and Grandy, A. S.: Direct evidence for  
629 microbial-derived soil organic matter formation and its ecophysiological controls,  
630 *Nat. Commun.*, 7, 13630, <https://doi.org/10.1038/ncomms13630>, 2016.

631 Kassambara, A.: *ggpubr*: 'ggplot2' Based Publication Ready Plots, R package version  
632 0.5.0., <https://CRAN.R-project.org/package=ggpubr>, 2022.

633 Keith, D. A., Ferrer-Paris, J. R., Nicholson, E., Bishop, M. J., Polidoro, B. A.,  
634 Ramirez-Llodra, E., Tozer, M. G., Nel, J. L., Nally, R. M., Gregr, E. J.,

635 Watermeyer, K. E., Essl, F., Faber-Langendoen, D., Franklin, J., Lehmann, C. E.  
636 R., Etter, A., Roux, D. J., Stark, J. S., Rowland, J. A., Brummitt, N. A.,  
637 Fernandez-Arcaya, U. C., Suthers, I. M., Wisser, S. K., Donohue, I., Jackson, L. J.,  
638 Pennington, R. T., Iliffe, T. M., Gerovasileiou, V., Giller, P., Robson, B. J.,  
639 Pettorelli, N., Andrade, A., Lindgaard, A., Tahvanainen, T., Terauds, A.,  
640 Chadwick, M. A., Murray, N. J., Moat, J., Pliscoff, P., Zager, I., and Kingsford, R.  
641 T.: A function-based typology for Earth's ecosystems, *Nature*, 610, 513–518,  
642 <https://doi.org/10.1038/s41586-022-05318-4>, 2022.

643 Kleber, M., Bourg, I. C., Coward, E. K., Hansel, C. M., Myneni, S. C., and Nunan, N.:  
644 Dynamic interactions at the mineral–organic matter interface, *NAT REV EARTH*  
645 *ENV.*, 2, 402–421, <https://doi.org/10.1038/s43017-021-00162-y>, 2021.

646 Klink, S., Keller, A. B., Wild, A. J., Baumert, V. L., Gube, M., Lehndorff, E., Meyer,  
647 N., Mueller, C. W., Phillips, R. P., and Pausch, J.: Stable isotopes reveal that  
648 fungal residues contribute more to mineral-associated organic matter pools than  
649 plant residues, *Soil Biol. Biochem.*, 168, 108634,  
650 <https://doi.org/10.1016/j.soilbio.2022.108634>, 2022.

651 Kock, N.: Common method bias in PLS-SEM: A full collinearity assessment approach,  
652 *International Journal of e-Collaboration (IJEC)*, 11, 1–10,  
653 <https://doi.org/10.4018/ijec.2015100101>, 2015.

654 Körner, C.: The use of ‘altitude’ in ecological research, *Trends Ecol. Evol.*, 22, 569–  
655 574, <https://doi.org/10.1016/j.tree.2007.09.006>, 2007.

656 Lembrechts, J. J., van den Hoogen, J., Aalto, J., Ashcroft, M. B., De Frenne, P.,  
657 Kemppinen, J., Kopecký, M., Luoto, Maclean, M. I. M. D., Crowther, T. W.,  
658 Bailey, J. J., Haesen, S., Klinges, D. H., Niittynen, P., Scheffers, B. R., Van  
659 Meerbeek, K., Aartsma, P., Abdalaze, O., Abedi, M., Aerts, R., Ahmadian, N.,  
660 Ahrends, A., Alatalo, J. M., Alexander, J. M., Allonsius, C. N., Altman, J.,  
661 Ammann, C., Andres, C., Andrews, C., Ardö, J., Arriga, N., Arzac, A., Aschero,  
662 V., Assis, R. L., Assmann, J. J., Bader, M. Y., Bahalkeh, K., Barančok, P., Barrio,  
663 I. C., Barros, A., Barthe, M., Basham, E. W., Bauters, M., Bazzichetto, M.,  
664 Marchesini, L. B., Bell, M. C., Benavides, J. C., Alonso, J. L. B., Berauer, B. J.,  
665 Bjerke, J. W., Björk, R. G., Björkman, M. P., Björnsdóttir, K., Blonder, B.,  
666 Boeckx, P., Boike, J., Bokhorst, S., Brum, B. N. S., Bruna, J., Buchmann, N.,  
667 Buysse, P., Camargo, J. L., Campoe, O. C., Candan, O., Canessa, R., Cannone,  
668 N., and Hik, D. S.: Global maps of soil temperature, *Global Change Biol.*, 28,  
669 3110–3144, <https://doi.org/10.1111/gcb.16060>, 2022.

670 Lehmann, J., Hansel, C. M., Kaiser, C., Kleber, M., Maher, K., Manzoni, S., Nunan,  
671 N., Reichstein, M., Schimel, J. P., Torn, M. S., Wieder, W. R., and  
672 Kögel-Knabner, I.: Persistence of soil organic carbon caused by functional  
673 complexity, *Nat. Geosci.*, 13, 529–534,  
674 <https://doi.org/10.1038/s41561-020-0612-3>, 2020.

675 Lenardon, M. D., Whitton, R. K., Munro, C. A., Marshall, D., and Gow, N. A. R.:  
676 Individual chitin synthase enzymes synthesize microfibrils of differing structure  
677 at specific locations in the *Candida albicans* cell wall, *Mol. Microbiol.*, 66,  
678 1164–1173, <https://doi.org/10.1111/j.1365-2958.2007.05990.x>, 2007.

679 Liang, C., Amelung, W., Lehmann, J., and Kästner, M.: Quantitative assessment of  
680 microbial necromass contribution to soil organic matter, *Global Change Biol.*, 25,  
681 3578–3590, <https://doi.org/10.1111/gcb.14781>, 2019.

682 Liang, C., and Balser, T. C.: Microbial production of recalcitrant organic matter in  
683 global soils: implications for productivity and climate policy, *Nat. Rev.*  
684 *Microbiol.*, 9, 75–75, <https://doi.org/10.1038/nrmicro2386-c1>, 2011.

685 Liang, C., Schimel, J. P., and Jastrow, J. D.: The importance of anabolism in microbial  
686 control over soil carbon storage, *Nat. Microbiol.*, 2, 17105,  
687 <https://doi.org/10.1038/nmicrobiol.2017.105>, 2017.

688 Liu, C., Tian, J., Cheng, K., Xu, X., Wang, Y., Liu, X., Liu, Z., Bian, R., Zhang, X.,  
689 Xia, S., Zheng, J., Li, L., and Pan, G.: Topsoil microbial biomass carbon pool  
690 and the microbial quotient under distinct land-use types across China: A data  
691 synthesis, *SSE.*, 2, 5, <https://doi.org/10.48130/SSE-2023-0005>, 2023.

692 Liu, X., Tian, Y., Heinzle, J., Salas, E., Kwatcho-Kengdo, S., Borken, W.,  
693 Schindlbacher, A., and Wanek, W.: Long-term soil warming decreases soil  
694 microbial necromass carbon by adversely affecting its production and  
695 decomposition, *Global Change Biol.*, 30, e17379,  
696 <https://doi.org/10.1111/gcb.17379>, 2024.

697 Li, Y., Wang, S., Yang, Y., Ren, L., Wang, Z., Liao, Y., and Yong, T.: Global synthesis  
698 on the response of soil microbial necromass carbon to climate-smart agriculture,  
699 *Global Change Biol.*, 30(5), e17302, <https://doi.org/10.1111/gcb.17302>, 2024.

700 Lu, J.: Microbial necromass contribution to topsoil organic carbon storage of natural  
701 and agricultural ecosystems, *figshare* [data set],  
702 <https://doi.org/10.6084/m9.figshare.28827383>, 2025.

703 Luo, R., Kuzyakov, Y., Zhu, B., Qiang, W., Zhang, Y., and Pang, X.: Phosphorus  
704 addition decreases plant lignin but increases microbial necromass contribution to  
705 soil organic carbon in a subalpine forest, *Global Change Biol.*, 28, 4194–4210,  
706 <https://doi.org/10.1111/gcb.16205>, 2022.

707 Malik, A. A., Chowdhury, S., Schlager, V., Oliver, A., Puissant, J., Vazquez, P. G.,  
708 Jehmlich, N., von Bergen, M., Griffiths, R., and Gleixner, G.: Soil fungal:  
709 bacterial ratios are linked to altered carbon cycling, *Front. Microbiol.*, 7, 1247,  
710 <https://doi.org/10.3389/fmicb.2016.01247>, 2016.

711 Ma, T., Zhu, S., Wang, Z., Chen, D., Dai, G., Feng, B., Su, X., Hu, H., Li, K., Han, W.,  
712 Liang, C., Bai, Y., and Feng, X.: Divergent accumulation of microbial necromass  
713 and plant lignin components in grassland soils, *Nat. Commun.*, 9, 3480,  
714 <https://doi.org/10.1038/s41467-018-05891-1>, 2018.

715 Mooshammer, M., Wanek, W., Zechmeister-Boltenstern, S., and Richter, A.:  
716 Stoichiometric imbalances between terrestrial decomposer communities and their  
717 resources: mechanisms and implications of microbial adaptations to their  
718 resources, *Front. Microbiol.*, 5, 22, <https://doi.org/10.3389/fmicb.2014.00022>,  
719 2014.

720 Mou, Z., Kuang, L., He, L., Zhang, J., Zhang, X., Hui, D., Li, Y., Wu, W., Mei, Q., He,  
721 X., Kuang, Y., Wang, J., Wang, Y., Lambers, H., Sardans, J., Peñuelas, J., and Liu,  
722 Z.: Climatic and edaphic controls over the elevational pattern of microbial

723 necromass in subtropical forests, *Catena*, 207, 105707,  
724 <https://doi.org/10.1016/j.catena.2021.105707>, 2021.

725 Ni, X., Liao, S., Tan, S., Peng, Y., Wang, D., Yue, K., Wu, F., and Yang, Y.: The  
726 vertical distribution and control of microbial necromass carbon in forest soils,  
727 *Global Ecol. Biogeogr.*, 29, 1829–1839, <https://doi.org/10.1111/geb.13159>, 2020.

728 Oksanen, J., Blanchet, F. G., Friendly, M., Kindt, R., Legendre, P., McGlinn, D., and  
729 Wagner, H.: *vegan*: Community Ecology Package, R package version 2.5.7.,  
730 <https://CRAN.R-project.org/package=vegan>, 2020.

731 Poggio, L., De Sousa, L. M., Batjes, N. H., Heuvelink, G., Kempen, B., Ribeiro, E.,  
732 and Rossiter, D.: SoilGrids 2.0: producing soil information for the globe with  
733 quantified spatial uncertainty, *Soil*, 7, 217–240,  
734 <https://doi.org/10.5194/soil-7-217-2021>, 2021.

735 Qiu, H., Zheng, X., Ge, T., Dorodnikov, M., Chen, X., Hu, Y., Kuzyakov, Y., Wu, J.,  
736 Su, Y., and Zhang, Z.: Weaker priming and mineralisation of low molecular  
737 weight organic substances in paddy than in upland soil, *Eur. J. Soil Biol.*, 83, 9–  
738 17, <https://doi.org/10.1016/j.ejsobi.2017.09.008>, 2017.

739 R Core Team: R: A language and environment for statistical computing, R Foundation  
740 for Statistical Computing, Vienna, Austria, <https://www.R-project.org>, 2021.

741 Rosseel, Y.: *lavaan*: An R package for structural equation modeling, *J. Stat. Softw.*, 48,  
742 1–36, <https://doi.org/10.18637/jss.v048.i02>, 2012.

743 Sae-Tun, O., Bodner, G., Rosinger, C., Zechmeister-Boltenstern, S., Mentler, A., and  
744 Keiblinger, K.: Fungal biomass and microbial necromass facilitate soil carbon  
745 sequestration and aggregate stability under different soil tillage intensities, *Appl.*  
746 *Soil Ecol.*, 179, 104599, <https://doi.org/10.1016/j.apsoil.2022.104599>, 2022.

747 Sanaullah, M., Usman, M., Wakeel, A., Cheema, S. A., Ashraf, I., and Farooq, M.:  
748 Terrestrial ecosystem functioning affected by agricultural management systems:  
749 A review, *Soil Tillage Res.*, 196, 104464,  
750 <https://doi.org/10.1016/j.still.2019.104464>, 2020.

751 Six, J., Frey, S. D., Thiet, R. K., and Batten, K. M.: Bacterial and fungal contributions  
752 to carbon sequestration in agroecosystems, *Soil Sci. Soc. Am. J.*, 70, 555–569,  
753 <https://doi.org/10.2136/sssaj2004.0347>, 2006.

754 Spawn, S. A., Sullivan, C. C., Lark, T. J., and Gibbs, H. K.: Harmonized global maps  
755 of above and belowground biomass carbon density in the year 2010, *Sci. Data*, 7,  
756 112, <https://doi.org/10.1038/s41597-020-0444-4>, 2020.

757 Strickland, M. S., and Rousk, J.: Considering fungal: bacterial dominance in soils–  
758 methods, controls, and ecosystem implications, *Soil Biol. Biochem.*, 42, 1385–  
759 1395, <https://doi.org/10.1016/j.soilbio.2010.05.007>, 2010.

760 Štursová, M., Žifčáková, L., Leigh, M. B., Burgess, R., and Baldrian, P.: Cellulose  
761 utilization in forest litter and soil: identification of bacterial and fungal  
762 decomposers, *FEMS Microbiol. Ecol.*, 80, 735–746.  
763 <https://doi.org/10.1111/j.1574-6941.2012.01343.x>, 2012.

764 van Der Heijden, M. G., Bardgett, R. D., and van Straalen, N. M.: The unseen  
765 majority: soil microbes as drivers of plant diversity and productivity in terrestrial

766 ecosystems, Ecol. Lett., 11, 296–310,  
767 <https://doi.org/10.1111/j.1461-0248.2007.01139.x>, 2008.

768 Wang, B., An, S., Liang, C., Liu, Y., and Kuzyakov, Y.: Microbial necromass as the  
769 source of soil organic carbon in global ecosystems, *Soil Biol. Biochem.*, 162,  
770 108422, <https://doi.org/10.1016/j.soilbio.2021.108422>, 2021a.

771 Wang, B., Liang, C., Yao, H., Yang, E., and An, S.: The accumulation of microbial  
772 necromass carbon from litter to mineral soil and its contribution to soil organic  
773 carbon sequestration, *Catena*, 207, 105622,  
774 <https://doi.org/10.1016/j.catena.2021.105622>, 2021b.

775 Wang, C., and Kuzyakov, Y.: Mechanisms and implications of bacterial–fungal  
776 competition for soil resources, *ISME J.*, 18, wrac073,  
777 <https://doi.org/10.1093/ismejo/wrac073>, 2024.

778 Wang, Z., Zhao, M., Yan, Z., Yang, Y., Niklas, K. J., Huang, H., Mipam, T. D., He, X.,  
779 Hu, H., and Wright, S. J.: Global patterns and predictors of soil microbial  
780 biomass carbon, nitrogen, and phosphorus in terrestrial ecosystems, *Catena*, 211,  
781 106037, <https://doi.org/10.1016/j.catena.2022.106037>, 2022.

782 Wickham, H.: *ggplot2: elegant graphics for data analysis*. Springer-Verlag New York,  
783 <https://ggplot2.tidyverse.org>, 2016.

784 Wu, H., Xiang, W., Ouyang, S., Forrester, D. I., Zhou, B., Chen, L., Ge, T., Lei, P.,  
785 Chen, L., Zeng, Y., Song, X., Peñuelas, J., and Peng, C.: Linkage between tree  
786 species richness and soil microbial diversity improves phosphorus bioavailability,  
787 *Funct. Ecol.*, 33, 1549–1560, <https://doi.org/10.1111/1365-2435.13355>, 2019.

788 Wu, W., Feng, J., Wang, X., Xiao, J., Qin, W., and Zhu, B.: The response of soil  
789 microbial necromass carbon to global change: A global meta-analysis, *Catena*,  
790 249, 108693, <https://doi.org/10.1016/j.catena.2024.108693>, 2025.

791 Xu, S., Song, X., Zeng, H., and Wang, J.: Soil microbial necromass carbon in forests:  
792 A global synthesis of patterns and controlling factors, *Soil Ecol. Lett.*, 6(4),  
793 240237, <https://doi.org/10.1007/s42832-024-0237-3>, 2024.

794 Xu, Y., Sun, L., Gao, X., and Wang, J.: Contrasting response of fungal versus bacterial  
795 residue accumulation within soil aggregates to long-term fertilization, *Sci. Rep.*,  
796 12, 17834, <https://doi.org/10.1038/s41598-022-22064-9>, 2022.

797 Yu, K., van den Hoogen, J., Wang, Z., Averill, C., Routh, D., Smith, G. R., Drenovsky,  
798 R. E., Scow, K. M., Mo, F., Waldrop, M. P., Yang, Y., Tang, W., Vries, F. T. D.,  
799 Bardgett, R. D., Manning, P., Bastida, F., Baer, S. G., Bach, E. M., García, C.,  
800 Wang, Q., Ma, L., Chen, B., He, X., Teurlincx, S., Heijboer, A., Bradley, J. A.,  
801 and Crowther, T. W.: The biogeography of relative abundance of soil fungi  
802 versus bacteria in surface topsoil, *Earth Syst. Sci. Data*, 14, 4339–4350,  
803 <https://doi.org/10.5194/essd-14-4339-2022>, 2022.

804 Zhang, B., Zhu, S., Guo, L., Chen, G., Zhang, G., and Li, J.: Elevation-dependent  
805 distribution of soil microbial necromass carbon in *Pinus densata* Mast. Forests,  
806 *Appl. Soil Ecol.*, 209, 106049, <https://doi.org/10.1016/j.apsoil.2025.106049>,  
807 2025.

808 Zhang, Q., Li, X., Liu, J., Liu, J., Han, L., Wang, X., Liu, H., Xu, M., Yang, G., Ren,  
809 C., and Han, X.: The contribution of microbial necromass carbon to soil organic

810 carbon in soil aggregates, *Appl. Soil Ecol.*, 190, 104985,  
811 <https://doi.org/10.1016/j.apsoil.2023.104985>, 2023.

812 Zhang, X., Jia, J., Chen, L., Chu, H., He, J. S., Zhang, Y., and Feng, X.: Aridity and  
813 NPP constrain contribution of microbial necromass to soil organic carbon in the  
814 Qinghai-Tibet alpine grasslands, *Soil Biol. Biochem.*, 156, 108213,  
815 <https://doi.org/10.1016/j.soilbio.2021.108213>, 2021.

816 Zhao, M., and Running, S. W.: Drought-induced reduction in global terrestrial net  
817 primary production from 2000 through 2009, *Science*, 329, 940–943,  
818 <https://doi.org/10.1126/science.1192666>, 2010.

819 Zhao, X., Tian, P., Liu, S., Yin, P., Sun, Z., and Wang, Q.: Mean annual temperature  
820 and carbon availability respectively controlled the contributions of bacterial and  
821 fungal necromass to organic carbon accumulation in topsoil across China's  
822 forests, *Global Ecol. Biogeogr.*, 32, 120–131, <https://doi.org/10.1111/geb.13605>,  
823 2023.

824 Zhou, R., Liu, Y., Dungait, J. A., Kumar, A., Wang, J., Tiemann, L. K., Zhang, F.,  
825 Kuzyakov, Y., and Tian, J.: Microbial necromass in cropland soils: A global  
826 meta-analysis of management effects, *Global Change Biol.*, 29, 1998–2014,  
827 <https://doi.org/10.1111/gcb.16613>, 2023.

828 **Table 1. Summary of the contributions of fungal necromass carbon (FNC) and**  
 829 **bacterial necromass carbon (BNC) to SOC and the FNC/BNC ratio in**  
 830 **agricultural and natural ecosystems at the global scale investigated in this study.**

Ecosystem	FNC/SOC (%)		BNC/SOC (%)		FNC/BNC	
	Range	Mean± SE	Range	Mean± SE	Range	Mean± SE
<b>Natural ecosystem<sup>&amp;</sup></b> ( <i>N</i> = 341)	0.92– 96.29	29.24 ± 0.51 b*	0.25– 89.45	14.02 ± 0.36 b	0.12– 44.24	3.22 ± 0.11 a
<i>Forest</i> ( <i>N</i> = 195)	0.92– 96.29	29.11 ± 0.63 A <sup>#</sup>	0.94– 96.47	13.48 ± 0.43 A	0.22– 11.56	2.80 ± 0.07 A
<i>Grassland</i> ( <i>N</i> = 146)	0.96– 93.89	26.75 ± 0.74 A	0.25– 89.45	14.34 ± 0.60 A	0.05– 44.24	3.58 ± 0.22 A
<b>Agricultural ecosystem<sup>%</sup></b> ( <i>N</i> = 145)	0.09– 97.53	34.39 ± 0.67 a	0.81– 65.00	15.65 ± 0.33 a	0.02– 12.74	2.61 ± 0.06 b
<i>Dry land</i> ( <i>N</i> = 32)	3.01– 96.81	37.77 ± 1.15 A <sup>#</sup>	0.81– 65.00	17.34 ± 0.65 A	0.13– 9.12	2.87 ± 0.12 A
<i>Irrigated cropland</i> ( <i>N</i> = 72)	0.09– 97.25	35.35 ± 0.73 A	1.18– 62.47	15.95 ± 0.38 A	0.02– 12.74	2.51 ± 0.06 A
<i>Submerged paddy</i> ( <i>N</i> = 41)	4.96– 97.53	22.82 ± 1.55 B	1.48– 30.97	10.55 ± 0.66 B	0.31– 10.40	2.62 ± 0.16 A

831 Note: *N* refers to the number of study sites;

832 <sup>&</sup>Natural ecosystem includes forest and grassland;

833 <sup>%</sup>Agricultural ecosystem includes dry land, irrigated cropland, and submerged paddy;

834 <sup>\*</sup>Within the same column, values with different lowercase letters indicate a significant  
 835 difference in the same variable between agricultural and natural ecosystems

836 (Wilcoxon rank sum test; *P* < 0.05);

837 <sup>#</sup>Within the same column, values with different capital letters indicate a significant  
 838 difference in the same variable between forests and grasslands (Wilcoxon rank sum

839 test), as well as between dry land, irrigated cropland, and submerged paddy (Kruskal–

840 Wallis and Dunn’s post hoc tests; *P* < 0.05).

841 **Figure legends**

842 **Figure 1. Global distribution of the sites used in this study.** Ecosystem types are  
843 distinguished by distinct shapes and colors, with the numbers in parentheses  
844 indicating the number of study sites for each ecosystem type.

845 **Figure 2. Comparison of the contributions of MNC to SOC and their ratio in**  
846 **agricultural and natural ecosystems.** Colors indicate different ecosystems types.  
847 Significance levels: \*\*\* $P < 0.001$  and \* $P < 0.05$ .

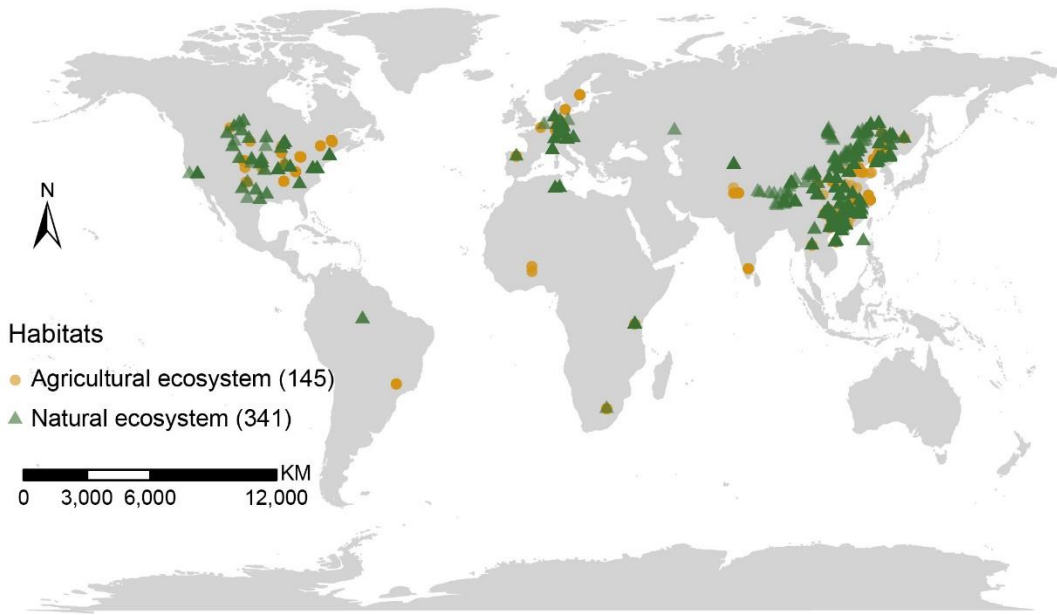
848 **Figure 3. Variations in the contributions of MNC to SOC and their ratio**  
849 **explained by four types of factors in agricultural and natural ecosystems.** Colors  
850 indicate different types of factors.

851 **Figure 4. Relative influence of different factors on the contributions of MNC to**  
852 **SOC and their ratio in agricultural and natural ecosystems.** MAT, mean annual  
853 temperature; MAP, mean annual precipitation; MBC, microbial biomass carbon; SOC,  
854 soil organic carbon; C/N, the ratio of SOC to total nitrogen (TN); MBC/MBN, the  
855 ratio of MBC to microbial biomass nitrogen (MBN); NPP, net primary production;  
856 BGBC, belowground biomass carbon density. Colors indicate different types of  
857 factors.

858 **Figure 5. The influence pathways of four types of factors on the contributions of**  
859 **MNC to SOC and their ratio in agricultural ecosystems.** Direct and indirect effects  
860 (a, c, e) and the standardized total effects (b, d, f) of different factors on the  
861 contributions of MNC to SOC and their ratio of agricultural ecosystems are shown.  
862 Standardized path coefficients representing the effect sizes of potential causal factors  
863 are indicated by numbers adjacent to arrows. The width of arrows is proportional to  
864 the potential causal effect between variables. The red arrows indicate positive effects,  
865 and the blue arrows indicate negative effects. The numbers adjacent to boxes of  
866 response variables denote the explained variance ( $R^2$ ). Right-angled rectangles denote  
867 single variables, whereas rounded rectangles represent composite variables. Colors  
868 indicate different types of factors. Significance levels: \*\*\* $P < 0.001$ , \*\* $P < 0.01$  and  
869 \* $P < 0.05$ . The *priori* models are shown in Figure S3.

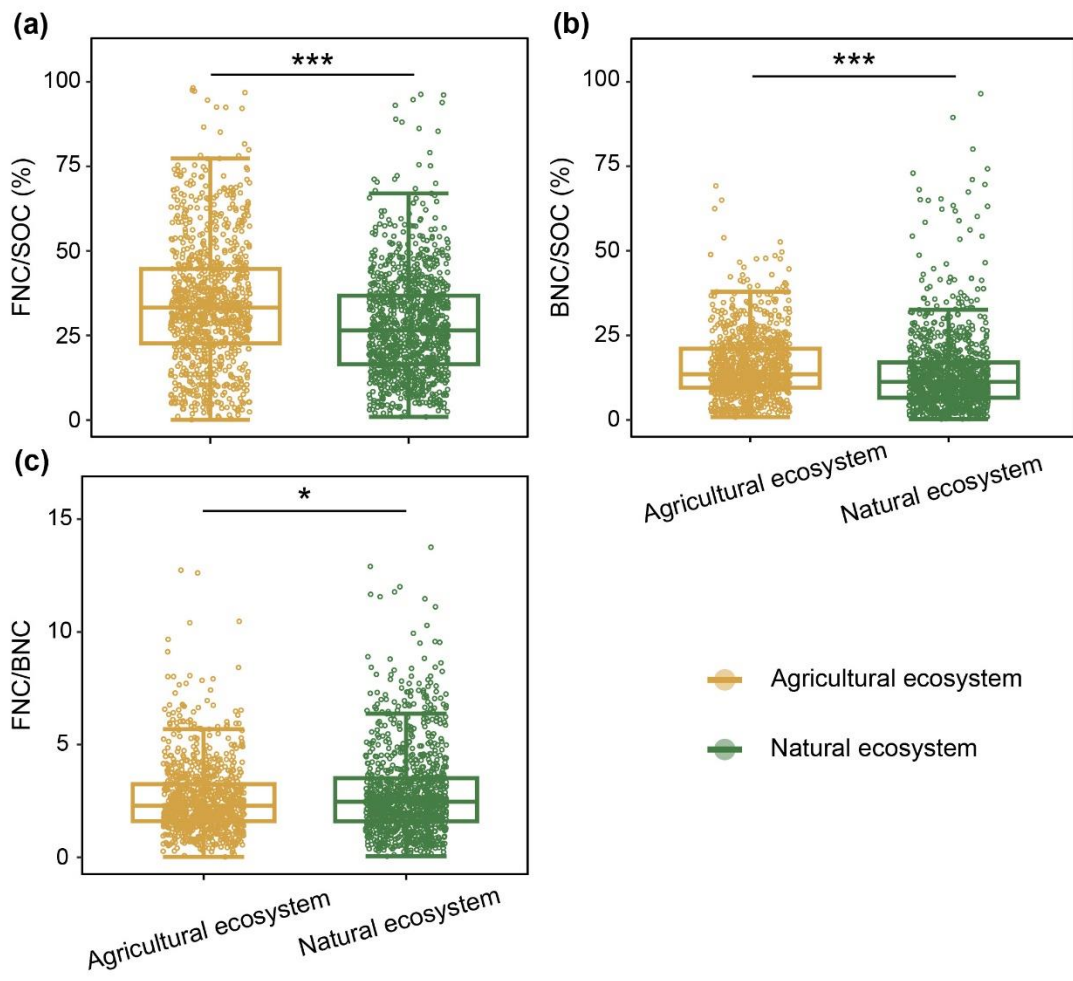
870 **Figure 6. The influence pathways of four types of factors on the contributions of**  
871 **MNC to SOC and their ratio in natural ecosystems.** Direct and indirect effects (a, c,  
872 e) and the standardized total effects (b, d, f) of different factors on the contributions of  
873 MNC to SOC and their ratio of natural ecosystems are shown. Standardized path  
874 coefficients representing the effect sizes of potential causal factors are indicated by  
875 numbers adjacent to arrows. The width of arrows is proportional to the potential  
876 causal effect between variables. The red arrows indicate positive effects, and the blue  
877 arrows indicate negative effects. The numbers adjacent to boxes of response variables  
878 denote the explained variance ( $R^2$ ). Right-angled rectangles denote single variables,  
879 whereas rounded rectangles represent composite variables. Colors indicate different  
880 types of factors. Significance levels: \*\*\* $P < 0.001$ , \*\* $P < 0.01$  and \* $P < 0.05$ . The  
881 *priori* models are shown in Figure S3.

882 **Figure 1.**



883

884 **Figure 2.**



885

