# 1 Fire effect and its legacy modulate soil bacterial and fungal communities in Chinese

# 2 boreal forests along a chronosequence

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# 18 Abstract

19	Wildfire has increasingly profound and pervasive consequences for forest ecosystems via
20	directly altering soil physicochemical properties and modulating microbial community. In
21	this study, we examined the changes in soil properties and microbial community at different
22	periods after highly severe wildfire events (44 plots, 113 samples) in the Chinese Great
23	Khingan Mountains. We also separated charcoals from burnt soils to establish the
24	relationship between soil microbes and the microbes colonized on the charcoal. Wildfire
25	significantly altered bacterial and fungal community structures across a 29-year
26	chronosequence. The network analysis revealed that from 17 years after fire, the complexity
27	and connectivity of bacterial and fungal communities were significantly increased.
28	Differential abundance analysis suggested that bacterial and fungal OTUs were enriched or
29	depleted only during 0-4 years after fire. In addition, soil factors, including soil pH, total C
30	and N, soil water content, and dissolved C and N, are key determinants of soil bacterial and
31	fungal communities from 17 years after fire. The fire-derived charcoals provided a new and
32	unusual niche for microbial colonization and charcoal microbes had a significantly different
33	community structure from the burnt soil microbes. Our data suggest that soil bacterial and
34	fungal communities changed dramatically during the recovery from fire events in terms of
35	the abundance and co-occurrence networks in the boreal forest ecosystems.

36 Importance

Pervious research has reported fire altered soil microbial community composition and
 function during short-term succession in boreal forests. However, the long-term effect of fire

39	and fire-derived charcoals which are regarded as fire legacy effect on soil bacterial and
40	fungal communities composition and structure have not previously been shown.
41	Understanding how soil microbes particularly the keystone taxa and determinative soil
42	factors, respond to fire and its legacy matter charcoal, is critical for predicting how future
43	fire influences soil nutrient transformations and biological processes. We accessed time
44	chronosequence to examine the effect of fire history on soil microbial abundance and
45	co-occurrence network. These findings suggest that soil microbes can be reshaped by fire
46	and its legacy effect of fire-derived charcoal even in the long periods after fire and provide
47	further insights into fire and its legacy effect.
48	Keywords: Wildfire; Fire history; Legacy effect; Microbial community; Charcoal; Soil

49 factors; Forest ecosystems

#### 50 Introduction

Fire is one of the most important disturbance agents in terrestrial ecosystems and a 51 worldwide phenomenon in our earth (1). Ecosystems such as boreal forests, shrublands, 52 grasslands and savannas, which have been regarded as "flammable systems", are often 53 disturbed by wildfires over millions of years (2). Triggered by heat, fire affects soil 54 microbiota and nutrient cycling directly and indirectly (3, 4). Basically, severe wildfire 55 changes critical biotic and abiotic processes to cause complex consequences, including 56 significant removal of plant shoot and organic matter, destruction of the soil physical 57 structure and porosity, increase in nutrient losses through leaching and volatilization and 58 considerable shift of chemical properties (3, 5–7). Fire breaks biomolecules (8) by exposing 59 soil microbes directly to extremely high temperatures and lowers bacterial and fungal 60 biomass (by 33 - 49%) (4, 9). Meanwhile, fire-based disturbance also modifies microbial 61 community diversity and phylogenetic structure, which link to carbon dynamics and thawing 62 of permafrost (10, 11). 63

Boreal forest is a major fire-prone biome, covering approximately 30% area of the global forest area. Distributed in high-latitude regions of Eurasia and North America, boreal forests have low productivity and are easily forced by fire and climate change (12). During long-term persistence and repeated succession, boreal forest ecosystems are tied to corresponding fire patterns and post-fire effects. Future climate change (such as global warming and drought) is likely to increase fire frequency and severity (13–15). Fire regimes have brought international concerns in the global boreal forests.

71	In China, boreal forest landscapes encompass the most southern parts of the global
72	boreal forest (16). Most fires occur as a surface fire which is usually of moderate to high
73	severity, with an estimated historical fire interval period of 30-120 years (17). Chinese boreal
74	forests store approximately 24-31% of total carbon storage (1.0-1.5 Pg C) in China (14) and
75	the average of annual carbon emissions from boreal forest fire up to 0.54 Tg (18). Moreover,
76	strict fire suppression has been implemented in this region for over a half of century (19),
77	since a catastrophic wildfire (20) occurred on 6 May 1987. Such a human control has already
78	changed the fire regime-the patterns of fire spread, intensity, severity, frequency,
79	seasonality and ecological effects (2, 21).
80	The formation of charcoals is another important phenomenon during vegetation
81	burning, especially in the boreal forest region. Most carbon is converted to CO2 releasing to
82	the atmosphere while a small portion of forest fuel (plant biomass and soil organic matter) is
83	pyrolyzed into other forms of pyrogenic carbon (PyC) (22). The PyC is a term synonymous
84	with black carbon (23) and is mainly produced as solid charred residue including
85	visually-defined charcoal and much lower proportions of volatile soot (24). Charcoal is part
86	of the PyC continuum. Because of its resistance to decomposition, it serves as (1) historic
87	records of fire and estimates for fire activities (1, 25), (2) an important long-term carbon sink
88	(22, 23, 26) and (3) different habitat patches for soil microorganisms (27–29). In addition,
89	incorporation of fire-derived charcoal into forest soils has an impact on soil C and nutrient
90	cycles, and vegetation regeneration (30–32). Owing to the presence of charcoal, burning <i>per</i>
91	se contributes to the shifts in ecological properties (including soil biological properties).

Therefore, charcoal is thought to function as fire's black legacy. However, some studies have 92 revealed that charcoal produced in fire would re-mineralize or degrade more rapidly than 93 expected (33, 34). Charcoal persistence directly influences soil properties in decades and 94 indirectly affect microbial community succession. 95 The effect of fire on soil biogeochemical and microbial processes can last for decades 96 and even centuries (35). The short-term effects of fire on soil pH, water content, organic 97 matter content, soil autotrophic respiration, and concentrations of total N, ammonium and 98 cations (K, Na, Ca, and Mg) are also observed in the boreal region (7, 37, 38). These effects 99 on soil properties in turn influence soil microbial community diversity and structure (7). 100 101 However, recovery patterns of soil microbial community and the functioning from fire events are currently unclear in boreal ecosystems. The information is limited about the direct 102 and indirect impacts of fire, associated changes in edaphic factors and fire-derived charcoal 103 on soil microbes over long-term scales. The knowledge gap still exists in understanding 104

complex and diversified interactions among soil microorganisms with the soil environment
(such as in the soil-charcoal system). In addition, we use "space-for-time" substitution (39)
as a judicious strategy for chronosequence research. On the other hand, it is difficult to
separate charcoal particles from the soil and hence to identify specific taxa colonized in the
charcoal or soil samples. Consequently, we are not able to quantitatively assess the effect of

each individual factor even if charcoal could affect microbial community assembly through
several known pathways (40).

113	history on soil microbial community recovery processes. Specifically, we quantified the
114	responses of soil microbes to fire and its legacy effect of fire-derived charcoal, and
115	determined the key determinants of bacterial and fungal community structure. We
116	hypothesized that (i) bacterial and fungal co-occurrence networks would become more
117	complex and connected with increasing time since fire (TSF), and (ii) the fire-derived
118	charcoal provided a unique niche for soil microbes and had microbial communities distinct
119	from the soil, and (iii) some soil properties would be the key determinants of soil microbial
120	community structure in soils with different fire histories.
121	
122	Results
123	Effect of fire on soil properties and microbial communities
124	Fire enhanced the mean concentration of soil available P from 5.4 to 19.3 $\mu$ g g <sup>-1</sup> ( $p < 0.01$ )
125	(Table S2) in A horizon. Compared with the unburnt controls, middle-term fires (MF)
126	increased available P by 224% and old fires (OF) increased available P by 257%. However,
127	no significant changes ( $p > 0.05$ ) in soil properties were observed in O horizon. Severe
128	wildfires significantly increased soil C/N ratio and the concentrations of available P in both
129	horizons ( $p < 0.05$ ) (Fig. S2). There was no statistical difference in other soil properties (Fig.
130	S2).
124 125	Fire enhanced the mean concentration of soil available P from 5.4 to 19.3 $\mu$ g (Table S2) in A horizon. Compared with the unburnt controls, middle-term fin

- In total, 10480 bacterial and 56 archaeal OTUs were identified from 16S sequences,
- while 2711 classified fungal OTUs assigned from 18S sequences. Proteobacteria

133	(30.6%-40.4%) were the most abundant phylum of bacteria overall in the soil samples (Fig.
134	1d), followed by Actinobacteria (22.2%-32.0%), Acidobacteria (12.6%-16.6%) and
135	Verrucomicrobia (4.2%-10.9%) (Table S3). Relative abundances of Proteobacteria,
136	Actinobacteria and Acidobacteria were generally constant across different fire histories
137	(Table S3), irrespective of soil horizon. Most of fungal OTUs were in Ascomycota
138	(41.3%-60.1%), with fewer in Basidiomycota (26.1%-49.4%) and Mucoromycota
139	(8.3%-13.2%) (Table S3). The proportions of dominant phyla were variable in the post-fire
140	soils. Overall, there is no significant temporal variation on taxonomic composition after fire
141	(Fig. 1d). Alpha diversity indices (includes Shannon index and OTU richness) of bacterial
142	and fungal communities did not vary significantly between the fire-affected (RF, MF, OF)
143	and unaffected groups (UF) (Fig. 1c). However, wildfire caused significant differences ( $p <$
144	0.001, PERMANOVA) in $\beta$ -diversity of soil microbial community (Fig. 1a & b) across
145	different fire histories (RF, MF, OF and UF). The NMDS of Bray-Curtis dissimilarities also
146	displayed that bacterial and fungal $\beta$ -diversities in O horizon were significantly ( $p < 0.005$ ,
147	PERMANOVA) different from those in A horizon (Table S4).

# 148 Effect of fire on differential OTUs

Differential abundances in bacterial and fungal community composition after wildfire across
a chronosequence were identified (Fig. 2). The enrichment and depletion effects on bacterial

- communities in O (20 vs. 0) and A (13 vs. 1) horizons were the most remarkable in the
- recent burnt soils (RF). There are no differential abundances in bacterial community
- 153 composition after middle-term and old fires, compared with the unburnt soil (Table S5).

154	After fire (RF vs. UF), the changes of bacterial composition were mostly positive. In the
155	period of 0-4 years after fire, differential OTUs had at least 3.5-fold enrichment in bacteria in
156	both O and A horizons (Fig. 2a). There were a number of spore-forming bacterial taxa,
157	including the group of Terrabacteria (Battistuzzi and Hedges, 2009). Terrabacterial phyla
158	(Order Bacillales and Order Micromonosporales) were only significant in O horizon but not
159	found in A horizon. However, the abundance of many fungal OTUs (e.g. Ascomycota and
160	Basidiomycota) were declined significantly after recent fires, especially in A horizon (Fig.
161	2b). Similarly, the RF group also had the most enriched and depleted fungal OTUs in O (17
162	vs. 7) and A (11 vs. 20) horizons compared with the unburnt soils (Table S6). There were
163	more fungal differential OTUs in A horizon than in O horizon (Fig. 2b). Moreover, the MF
164	group had only one significantly enriched OTU while the OF group had only one depleted
165	OTU (Table S6).

#### 166 Bacterial and fungal co-occurrence networks

To identify the co-occurrence patterns of bacterial and fungal communities in soils with 167 different fire histories, we constructed bacterial and fungal networks for the two horizons. 168 The networks displayed remarkable differences in their structure and topology (Figs 3 & 4). 169 The bacterial network of the UF group in O horizon consisted of 64 nodes (i.e. taxa) and 57 170 edges (associations between taxa), while the RF group in O horizon consisted of 60 nodes 171 and 30 edges. In stark contrast, the OF group in O horizon consisted of 222 nodes and 380 172 edges (Table 1). The average degree and the average number of neighbors of bacterial 173 network in the OF group were also considerably higher than the UF and other fire-affected 174

groups. The higher complexity and connectivity in the OF bacterial network showed that the 175 special and complicate modules had been formed during long periods after wildfire (Fig. 2d). 176 There were similar results in A horizon that more complex coupling among bacteria occurred 177 during the post-fire succession process (Figs S5a & d). 178 Multiple topological properties of the fungal co-occurrence networks pronouncedly 179 varied in different fire histories (Table S7). The fungal network of the OF was largest with 180 152 nodes and 253 edges and had the highest average degree in O horizon (Table 1). Higher 181 complexity in the OF group was visible, indicating that many fungi had developed a number 182 of associations (Fig. 3). We observed that both modularity and average path length of fungal 183 network in the OF group were highest in O horizon, showing more structured fungal 184 communities within the network. Unlike bacterial patterns, fungal co-occurrence patterns of 185 the OF group were more modular than the corresponding unburnt soil networks. Moreover, 186 the connections between fungi in A horizon were gradually increased after wildfire 187

188 disturbance (Fig. S6).

# 189 The effects of fire-derived charcoal

To gain insight into the fire legacy effect, we compared microbial properties in charcoal samples with soils. Despite common patterns in the relative abundance of main taxa at the phylum level, microbial community composition, especially for fungi, had some apparent divergences between charcoal and soil, and between different fire histories (Fig. 1d). The predominant phyla (ascomycota, basidiomycota, and mucoromycota) significantly differed in their relative abundances in the charcoal and unburnt soils (Table S3). Unlike burnt soils,

196	charcoal samples had an enhanced colonization of differential bacterial and fungal OTUs
197	from the unburnt controls (Fig. 2c & d). On the other hand, the burnt soil samples of O
198	horizon had more similar microbial composition to the unburnt sites than to charcoal samples,
199	as indicated by nearly zero differential OTUs (Fig. 2c & d). Bray-Curtis dissimilarity was
200	used to assess the structure of microbial community colonized on the surface of fire-derived
201	charcoal or inhabited within the soil. NMDS ordination revealed significant differences ( $p <$
202	0.001, PERMANOVA) among charcoal, unburnt, and burnt soil samples (Fig. S4) for
203	bacteria ( $R^2 = 0.30$ , <i>pseudo</i> F = 23.5) and fungi ( $R^2 = 0.19$ , <i>pseudo</i> F = 13.2). These results
204	showed that the charcoal colonized distinct microbial community, as fire legacy effect. The
205	explanation of variance to 40.7% in the soil fungal community structure on SEM (including
206	charcoal microbial community) while explanation of variance decreased slightly to 41.4%
207	for bacterial community structure (Fig. 6a & b). Based on SEM, fire significantly affected
208	bacterial and fungal community in charcoal and bacterial community in charcoal also
209	significantly affected bacterial community in soil.

# 210 The influence of soil properties on microbial community

The relationships between soil properties and soil microbial community structure varied with different fire histories and horizons (Fig. 5). Soil pH, soil organic matter, total N, total P, dissolved organic C, and dissolved organic N had significant relationships with bacterial community structure in both O and A horizons of the OF group. However, in the RF and MF groups, most of soil factors had no significant correlations with bacterial community structure. Soil factors, such as pH, soil organic matter, total P, dissolved organic C and

217	dissolved organic N, significantly correlated with the structures of fungal community in O
218	horizon (Fig. 5). More soil factors had significant relationships with bacterial than fungal
219	community structure. In O horizon of the OF group, bacterial community structure correlated
220	highest with pH (r = 0.8095, $p = 0.0001$ ) while fungal community structure correlated
221	highest with dissolved organic C (r = 0.6691, $p = 0.0001$ ) across all the environmental
222	variables (Table S8).

223

#### 224 **Discussion**

# 225 Temporal patterns of bacterial and fungal communities in response to fire

This study demonstrates that wildfire has an impact on bacterial and fungal composition, and 226 thereby modulates the patterns of soil microbial community succession over three decades 227 after fire in the boreal forest region. Translated spatial differences into temporal changes, our 228 results clearly show that temporal patterns of bacterial and fungal communities occur across 229 a chronosequence. Supported by previous findings about bacterial diversity shifts under fire 230 disturbance (7), wildfire does not show significant impacts on microbial  $\alpha$ -diversity 231 (Shannon index and OTU richness) both in O and A horizons. Only fungal  $\alpha$ -diversity in A 232 horizon significantly declined by the recent fires, corresponding with fungal co-occurrence 233 networks in this horizon (Fig. S6b). This is in agreement with previous studies that fungal 234 diversity changed significantly in 2 years after fire across a 152-year chronosequence (41). In 235 addition, the fire-related effect on species richness of ectomycorrhizal fungi has not been 236 observed on many fire-affected soils, and mycorrhizal colonization of roots may increase 237

after a fire event (42). However, in Alaskan boreal forests, soil fungal community diversity 238 (Shannon index) varied significantly only in the 90-year-old site, not in sites with 239 shorter-term fire history across a 100-year chronosequence (43). Therefore, soil bacterial and 240 fungal community diversities have concomitantly and rapidly recovered, suggesting that fire 241 only has a limited impact on bacterial and fungal diversity across a chronosequence. 242 In general, wildfire is reported to have a distinct effect on soil microbial community 243 composition. Our results demonstrate that the bacterial and fungal community compositions 244 differ among fire history. Bacterial and fungal community structures have an underlying 245 trend clustered with increasing TSF (Fig. S3), which means fire has a significant effect on 246 soil microbial structure across a chronosequence. This phenomenon goes beyond previous 247 results reporting that bacterial community altered dramatically after 16 weeks since fire (44) 248 and could return to similar levels of the controls after 11 years (45). Yet, there are different 249 temporal patterns for bacteria and fungi under fire disturbance. Bacteria under the MF and 250 UF groups were closely clustered in the NMDS plot. Their co-occurrence networks and 251 topological networks are similar to those of other fire-affected groups in both O and A 252 horizons (Fig. S5). However, fungal co-occurrence always differs between the fire-affected 253 groups and the unburnt group, suggesting that the fungal communities still change after 29 254 years since fire. Our partial Mantel data show that bacterial community structure is 255 correlated with many soil factors in the OF group but correlated with few soil factors in the 256 RF and MF groups. These results indicate that fire-derived changes in soil properties become 257 the major determinants of soil microbial community composition in the post-fire succession 258

process. Our analysis further suggests that soil properties have significant effects on soil
microbial community especially for bacterial community as environmental filters from 17
years after fire. Furthermore, bacterial community was complexly modulated by soil factors
more significantly than fungal community.

Soil microbial co-occurrence networks, that provide insight into ecological interactions 263 among taxa, were influenced by fire history. The major changes in topological properties of 264 the bacterial and fungal networks have more nodes and edges under the OF group than the 265 UF group (Figs 2, 3, S5 & S6), predicting that microbial communities have more 266 connections and complex functional modules under fire disturbance. Fire reshapes soil 267 microbial network and makes microbial interaction stronger in both O and A horizons after 268 17 years since fire. In addition, during 1-15 years since fire (RF and MF groups), taxa only 269 form weak relationships and lower-complexity modules in most of the samples. Clearly, 270 bacteria and fungi need more than 15 years to recover and reconstruct ecological functioning 271 after fire events. Our results are in contrast to the short-term experiments (within 12 months 272 after fire) showing that fire did not alter co-occurrence network generally (46). 273 Specific bacterial and fungal taxa in response to fire 274

By using differential OTU abundance analysis across a chronosequence, we observed that only RF groups serve an enrichment/depletion role for microbial OTUs relative to the unburnt soil. There are few differential OTUs found in the MF and OF groups although microbial co-occurrence network in the MF and OF groups is significantly different from that in the UF group. These results indicate the number of most OTUs in post-fire boreal soil

back to pre-fire level after 7 years. Many bacterial species are able to cope with extreme 280 environments such as high temperature by forming resistant substances such as spores and 281 endospores (10). We observed that the RF group serves an enrichment role for a subset of 282 bacterial OTUs relative to the unburnt soil. The recent fires increased the number of 283 spore-forming OTUs in the order Micromonosporales (phylum Actinobacteria) and the 284 Gram-positive Bacillales (phylum Firmicutes). The Bacillales can generate dormant and 285 resistant spores that make them survive under harsh conditions for years (47). The Bacillales, 286 that consist of many spore-formers, allow themselves to recover better and faster from 287 stresses. Micromonosporales (genus Actinoplanes) also form spores by fragmentation to 288 reproduce (48). These post-fire increases in the number of bacterial OTUs are more in O 289 horizon than in A horizon, which could be linked to higher fire severity or upper fire loading 290 density in O horizon. The results of these differential bacterial OTUs are consistent with the 291 findings of many previous studies showing pronounced effects on soil bacterial community 292 in the short-term, mostly within 36 months after fire (6, 10, 49). Furthermore, apart from fire 293 severity, environmental factors (soil pH, soil water content, total C, dissolved C and N) are 294 also key determinants driving soil bacterial community. Some bacterial OTUs depend on 295 plant-soil feedback (50) and are strongly affected by aboveground community during forest 296 regeneration (51, 52). 297

We observed that there are many depleted ectomycorrhizal OTUs (such as Family Tricholomataceae) in O and A horizons, which is consistent with a previous study showing that forest fire caused a significant loss of ectomycorrhizal fungi biomass in the litter and

301	organic horizons (53). Severe fire consumes the most portion of humus on soil surface and
302	kills most of trees, and hence the death of ectomycorrhizal fungi although some
303	ectomycorrhizal fungi have sporophytes (54). Moreover, during the early successional phase
304	after fire disturbance, the regeneration has not reached pre-wildfire levels in the Great
305	Khingan Mountain. The impact of vegetative recovery on fungal community may play an
306	important role in enriched OTUs in O horizon. Furthermore, most of differential OTUs in A
307	horizon are depleted probably because vegetation including herbaceous species and shrubs
308	still cannot influence soil microbes in A horizon. However, many fungal species can still
309	survive and largely remain intact even after a high-intensity wildfire. The regeneration of
310	post-fire pyrophilous ascomycetes is well documented for the reasons such as the tolerance
311	of high pH and other physicochemical consequences of wildfire (42).

## 312 Fire legacy effect on soil microbial community

313 Our study, for the first time, examined the effect of fire-derived natural charcoal on soil microbial community along a chronosequence in a boreal forest region, and showed that the 314 microbial community colonized on the charcoal can influence the responses of soil microbial 315 community to wildfire. Due to specific porous structure and absorbed nutrients, charcoal is a 316 habitat for soil microbes and these microbes are significantly different from those in the 317 burnt soils (Fig. S4). The major taxa and  $\alpha$ -diversity of microbes in the charcoal (Figs 1 & 318 S4) are also distinct with the burnt forest soils, highlighting a new and unique habitat 319 produced by fire (28). Moreover, there are more than 680 bacterial OTUs and more than 120 320 fungal OTUs in the charcoal samples (Fig. 2c & d). Together these observations provide 321

strong evidence that fire-derived charcoal create distinct environments (including abiotic 322 factors and biotic factors) as the habitat for fire-responsive microbes. Because of its higher 323 pH value, charcoal causes a localized increase in soil pH (55, 56) and shifts the way of soil 324 pH effect on soil microbial community to some extent. Charcoal microbial community has a 325 significantly positive relationship with soil bacterial community (Fig. 6a), indicating that 326 microbes in soil are more likely impacted by post-fire charcoal. Charcoal microbial 327 community is also related to soil pH, dissolved organic C and total P which regulate 328 microbial activity with nutrient cycling. Previous studies have shown that charcoal absorbs 329 some labile C compounds to inhibit or activate some microbial processes (29, 40, 57). 330 However, our present study has not found that dissolved organic C has any specific 331 relationship with bacteria or fungi in the charcoal. Based on SEM, fire (represented by TSF) 332 affects soil microbial community via the indirect effect of charcoal. Furthermore, charcoal 333 community structure varied with TSF showing that the ecological recovery processes after 334 fire occur in the charcoal particles and the fire legacy effect gradually changes over time. 335 **Conclusions** 336 This study provides the key evidence how large-scale wildfire events and the derived 337 charcoal (fire legacy effect) affect soil microbial community along a 29-year chronosequence 338 of the boreal forest region in northeast China. It reveals that wildfire significantly impacts on 339 bacterial and fungal community structures. The complexity and connectivity of bacterial and 340 fungal communities were significantly enhanced from 17 years after fire when soil pH, total 341

342 C and N, soil water content, and dissolved C and N are key determinants of soil bacterial and

343	fungal communities. Furthermore, the charcoal formed at fire events and its colonized
344	microbes have important ecological functions of mediating post-fire successional boreal
345	forests although our current knowledge of the succession patterns about soil microbes
346	post-fire and charcoal functions in flammable boreal forest ecosystems is limited. Our
347	research highlights an important step forward to clarifying the effects of fire and its charcoal
348	on soil microbial community. Further research may aim at (i) identifying specific
349	physiological and biochemical processes in response to fire events and fire history and (ii)
350	distinguishing charcoal microbial community from post-fire soil microbial community in
351	finer details.
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<ul> <li>353</li> <li>354</li> <li>355</li> <li>356</li> <li>357</li> <li>358</li> <li>359</li> <li>360</li> <li>361</li> </ul>	Materials and methodsStudy area and experimental designThis study was carried out in the boreal forest region, the Great Khingan Mountains(50'10'N-53'33'N, 121'12'E-127'00'E), north-eastern China (Fig. S1). The mean annual airtemperature in this region is -2 to -4 °C and the mean annual rainfall is 350~500 mm (18).The soil at the sampling sites is classified as dark brown forest soil (Inceptisol) and theparent material is granite bedrock (45, 58). The vegetation of this region is representative ofboreal coniferous forests, forming the southern extension of the Siberian boreal forests.Transition plant species, dominated by larch (Larix gmelini), are late-successional and

mainly birch (*Betula platyphylla*), are the earliest re-generation in the post-fire soil. They are 363 succeeded by boreal conifer tree species in the wildfire-disturbed boreal forest ecosystems. 364 We selected a total number of 44 plots ( $50 \times 50$  m) at altitudes ranging from 209 m to 365 466 m a.s.l. (Table S1) in July 2015. Plots including fire-affected and unaffected groups, 366 were located at the National Reserve and State-owned Forest with minimal human 367 interventions (e.g. prescribed fire, and logging). Due to the difficulty of long-term studies 368 and specificity of fire researches, we followed a classical space-for-time substitution method 369 to assess the impacts of fire and its legacy charcoal. Fire-affected groups consisted of a 370 chronosequence of burnt forests that were representative of different TSF (59), considered as 371 different fire histories. These affected groups were divided into Recent Fires (RF: 0-4 years 372 since fire, n=9), Middle-term Fires (MF: 7-15 years since fire, n=12), and Old Fires (OF: 373 17-29 years since fire, n=12) based on TSF. Each fire-affected site was considered as an 374 independent replicate and more information about TSF is given in the Supplementary 375 Information. 376 According to the historical records from the State Forest Administration and remote 377

sensing images, each of the fire-affected sampling sites had suffered one highly severe
wildfire during 1915-2015. The highly severe wildfire here means destroying at least one
hundred hectares of forests and removing litter and organic soil layer (60). To save
expenditure, we only sampled fire-unaffected controls (UF, n=11) nearby the burnt plots
with distinct burnt borders. The minimum distance between each plot was 100 meters. For
reducing spatial heterogeneity, all plot samples were comprised of more than five

subsamples  $(10 \times 10 \text{ m})$  and each subsample was homogenized by at least ten soil cores. Given that plots were structurally analogous, all samples followed by unified strict selection criteria including a slope of  $< 15^{\circ}$ , the same soil type and a similar landform.

#### 387 Sampling, charcoal separation and physicochemical analysis

During sampling, the litter layer (a laminated mixing of small twigs, roots and fungal 388 hyphae) was first removed and the organic layer (O horizon) comprising dark colored 389 materials with fewer small roots and charcoal pieces were collected. Then, the top 15-cm 390 mineral soil (A horizon) was collected using a soil auger (4 cm diameter). Soils were placed 391 in the aseptic plastic bags for subsequent processing. Samples were transported to laboratory 392 on ice, immediately sieved through a 2-mm mesh and stored at -80 °C (for DNA extraction) 393 and 4 °C (for physicochemical analyses). Soil physicochemical properties included total C 394 (%), N (%), P (mg kg<sup>-1</sup>), soil organic matter (SOM), pH, soil gravimetric water content, 395 available P, dissolved organic C, dissolved inorganic C, dissolved organic N and 396 exchangeable Na, K, Mg, and Ca. Detailed information on soil analyses is given in the 397 Supplementary Information. 398

To minimize disturbance of microbial community, we adopted a direct hand-picked method (61, 62), rather than the water-floating method, to separate charcoal particles from the O-horizon soil. These "charcoal" particles in this study were defined as solid residual pieces derived from the pyrolysis of plant biomass by fire. Many researches showed that 1-3 mm char-particles (including biochar, charcoal) are easily extracted from soil (63–65), and in view of this phenomenon, we separated macroscopic charcoal particles (>1 mm in diameter)

from the sieved soil. We used a specific tweezer (N5, Dumont, Switzerland), which could 405 isolate visible charcoal particles larger than 50 µm under microscope. Followed by the same 406 criteria of microscopy and mineralogy, we collected charcoal approximately 15 g per plot for 407 later analyses and characterization. The details of charcoal isolation from soil are presented 408 in Supplementary Information. Collected charcoal pieces were crushed gently, homogenized 409 and stored at -80 °C for DNA extraction and physicochemical analyses. 410 Illumina sequencing and bioinformatic analysis 411 DNA was extracted from all soil (0.50 g) and charcoal (0.2-0.4 g) samples using the MP 412

413 FastDNA SPIN Kit for soil (MP Biomedicals, Solon, OH, USA) according to the

414 manufacturer's protocol. Extracted DNA was stored at -20°C for a maximum of one week

until amplicon library preparation began. PCR amplification was performed on the V4-V5

region of bacterial 16S rRNA gene using primers 515F/907R (66, 67) and the V4 region of

417 18S rRNA using primers 528F/706R (68, 69). The concentration and purity of DNA were

418 monitored on 1% agarose gels. According to actual concentration, DNA was diluted to about

419 1 ng  $\mu$ L<sup>-1</sup> using sterile water. 16S /18S rRNA genes were amplified used specific primers

420 with the barcode. All PCR reactions were carried out in a volume of 30  $\mu$ L using 15  $\mu$ L of

421 Phusion<sup>®</sup> High-Fidelity PCR Master Mix (New England Biolabs), 0.2 μM of forward

422 primers, 0.2 μM of reverse primers and 10 μL sample DNA. The PCR consisted of 98 °C for

423 1 min, then 30 cycles at 98°C for 10 s, 50 °C for 30 s, 72 °C for 30 s, and finally 72 °C for 5

424 min. PCR products were mixed in equidensity ratios and purified before sequencing libraries

425 were generated. The library quality was assessed on the Qubit@ 2.0 Fluorometer (Thermo

426	Scientific) and Agilent Bioanalyzer 2100 system. At last, the library was sequenced on an
427	Illumina HiSeq 2500 and 250 bp paired-end reads were generated.
428	Briefly, the raw sequences from HiSeq platform were merged by using FLASH (70) and
429	were assigned to each sample according to the specific barcodes. The sequences were
430	pre-filtered and removed chimeras (71) by QIIME's (72) quality filters. All effective
431	sequences were then clustered into operational taxonomic units (OTUs) by Uparse (73)
432	based on 97% similarity level. We picked the highest frequent sequence for each OTU as
433	their representative sequences. We used the Ribosomal Database Project's classifier (74)
434	against the SILVA 132 database (75) to annotate taxonomic information for bacteria (16S)
435	and eukaryotes (18S). RDP classifier bootstrap confidence values were 0.8-1. We
436	normalized the read counts in OTU table by rarefying to the minimum sequence number
437	within all samples. Moreover, to parse fungal OTUs by ecological guilds, we used
438	FUNGuild to annotate fungal taxa into different functional groups (i.e. saprotroph,
439	pathotroph and symbiotroph) (76). Raw sequence data were deposited into the Genome
440	Sequence Archive (GSA) database under accession numbers CRA002389 that are publicly
441	accessible.
442	Statistical analysis

443 All statistical analyses were performed using R v. 3.5.3 (77) using the rarefied data on 444 the following packages: phyloseq (78), ggplot2 (79), reshape2 (80), plyr (81), except for the 445 analysis using non-rarefied data (82). Here,  $\alpha$ -diversity metrics included Shannon index and 446 OTU richness (namely species richness), which were calculated using the "plot\_richness"

447	function (phyloseq) and Picante package (83). The vegan package (84) was used to assess
448	$\beta$ -diversity via non-metric multidimensional scaling (NMDS) ordination using "metaMDS"
449	function, based on Bray-Curtis dissimilarities. Bacterial and fungal communities in charcoal
450	and soil samples were determined separately by the differential abundance analysis
451	compared with the unburnt soils in each soil horizon. The package 'DESeq2' (85) was used
452	to calculate the differential abundance (Log <sub>2</sub> fold change in relative abundance of OTUs)
453	using non-rarefied data. DESeq2 was run using the Wald test and an alpha of 0.01.
454	To reduce network complexity, we removed OTUs with relative abundances less than
455	0.001% of the total number of bacterial and fungal sequences, respectively. We then
456	calculated all possible Spearman's rank correlations between OTUs more than three
457	sequences using the WGCNA package (86). The nodes in the networks represent microbial
458	taxa (OTUs) and the edges represent significant correlations between the nodes. The $p$ values
459	were adjusted using the the Benjamini-Hochberg false discovery rate (FDR) controlling
460	procedure (87), as implemented in the multtest package (88). A valid co-occurrence network
461	was considered a statistically robust correlation between taxa when the correlation
462	coefficients threshold was above 0.8 and FDR-adjusted $p$ value was below 0.01. Network
463	visualization was conducted using Cytoscape version 3.8.0 (89), and topographical
464	properties (including average degree, average path length, network diameter, and clustering
465	coefficient) of networks were calculated using Gephi software (90).
466	To investigate the importance of fire effect and soil properties, a permutational
467	multivariate analysis of variance (PERMANOVA) was performed on Bray-Curtis

dissimilarities using the "adonis" function of vegan (nperm=9999). Partial Mantel tests were 468 conducted to test the effects of soil properties on the compositional similarity of OTUs using 469 vegan package. Moreover, the effects of spatial variation (i.e. longitude and latitude) were 470 controlled while testing the correlation of soil factors and the microbial community of burnt 471 and unburnt soils. Soil properties, the relative abundances of taxa and  $\alpha$ -diversity indices 472 were performed by ANOVA, and pair-wise differences were assessed by Tukey's HSD 473 post-hoc tests as implemented in agricolae package. The Kruskal-Wallis test instead was 474 used for the data with abnormal distribution or homoscedastic. To further test the effect of 475 fire (including TSF and charcoal) on soil factors and soil community structure of bacteria 476 and fungi, we built Structural Equation Modeling (SEM) by "sem" function from the lavaan 477 package. A priori models based on the results of linear mixed-effect model (Fig. S7). We 478 used fire effect (TSF) and fundamental edaphic factors (pH, dissolved organic C) as 479 exogenous variables, and soil total N and P, and microbial community in charcoal as 480 endogenous variables (Fig. 6). Exploratory analyses showed dissolved organic C had a better 481 fit and explanation than soil organic matter or total C. Importantly, the microbial community 482 colonized on the separated charcoal particles were hypothesized as key links between fire 483 effect and soil microbial community. The goodness of fit was considered on the basis of 484 chi-square test and root-mean-square error of approximation (RMSEA). A model could be 485 accepted when *p*-value > 0.05, comparative fit index (CFI) > 0.95 and RMSEA < 0.05. 486 487

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exploring and manipulating networks.

# 737 **Tables**

- 738 **Table 1.** Topological properties of networks obtained at the different fire histories in O
- horizon. Fire histories are recent fires (RF), middle-term fires (MF), old fires (OF) and
- 740 unfired (UF).
- 741

Topological properties	UF	RF	MF	OF					
Bacteria									
Number of nodes	64	60	72	222					
Number of edges	57	30	62	380					
Average degree	1.781	1	1.722	3.423					
Modularity	0.845	0.967	0.907	0.737					
Average clustering coefficient	0.723	NA	1.000	0.490					
Average path length	1.68	1	1	4.052					
Average number of neighbors	1.78	1	1.72	3.42					
Fungi									
Number of nodes	67	48	16	152					
Number of edges	83	38	8	253					
Average degree	2.478	1.583	1	3.329					
Network diameter	4	4	1	7					
Modularity	0.807	0.828	0.875	0.917					
Average clustering coefficient	0.702	0.661	NA <sup>a</sup>	0.689					
Average path length	1.599	1.421	1	1.827					
Average number of neighbors	2.48	1.58	1	3.33					

<sup>742</sup> <sup>a</sup>NA means not applicable.

#### 743 **Figures**

744



Figure 1. Microbial composition and structure in soils and charcoal samples of different fire 745 histories and soil horizons. Non-metric multidimensional scaling ordination plot based on 746 Bray-Curtis dissimilarity showing the change of soil bacterial (a) and fungal (b) community 747 structure. Purple, red, orange and green symbols represent unburnt controls (UF), and recent 748 (RF, 0-4 years), middle-term (MF, 7-15 years) and old fire (OF, 17-29 years), respectively. 749 As listed in the legend, solid circles and squares represent samples from the O and A 750 horizons, respectively. Boxplots of  $\alpha$ -diversity (c) for bacterial and fungal communities in 751 the soils and charcoal samples of different fire histories (UF, RF, MF and OF) in O and A 752 horizons. Boxes are bounded on the first and third quartiles, divided by median lines. Boxes 753 with different lower-case letters are significantly different (p < 0.05) by Bonferroni's post 754 hoc tests. Relative abundances of bacteria and fungi among different fire histories in O and 755

- A horizons at the phylum level (**d**). "Unclassified" OTUs indicate no taxonomic information
- matched in the database. Charcoal samples only were separated from burnt soils in O
- 758 horizons.



Figure 2. Enrichment (above 0) and depletion (below 0) of bacterial (a) and fungal (b) OTUs in soils after recent fires (RF, 0-4 years) compared 760 with unburnt soils by differential abundance analysis. The OTUs (singleton is exclusive) are arranged by family on the x-axis and each point 761 represents an individual OTU. The y-axis indicates fold change in log base 2 units. Skyblue points represent differential OTUs found in O 762 horizon while pink points represent differential OTUs found in A horizon. The significant threshold is 0.01. Enrichment (yellow triangles) and 763 depletion (green triangles) of OTUs (singleton is exclusive) about bacterial community (c) and fungal community (d) by differential abundance 764 analysis. Enrichment and depletion of certain OTUs in the charcoal and soil samples of recent (RF, 0-4 years), middle-term (MF, 7-15 years) and 765 old fire (OF, 17-29 years) compared to unburnt soil samples (black dots) in O horizon. The significant threshold is 0.01. Colored numbers 766 represent the number of differential OTUs. 767



769Figure 3. The co-occurrence networks of the bacterial community in O horizon under recent770fires (RF, b), middle-term fires (MF, c), old fires (OF, d) and unburnt groups (UF, a). A771connection stands for a strong (Spearman's p > 0.8) and significant (p < 0.01) correlation.772The size of each node is proportional to the relative abundance, as is shown in the legend.773The thickness of each edge is proportional to the value of Spearman's correlation774coefficients. The grey edges represent positive interactions between two bacterial nodes,775while red edges represent negative interactions.



777Figure 4. The co-occurrence networks of the fungal community in O horizon under recent778fires (RF, b), middle-term fires (MF, c), old fires (OF, d) and unburnt groups (UF, a). A779connection stands for a strong (Spearman's p > 0.8) and significant (p < 0.01) correlation.780The size of each node is proportional to the relative abundance, as is shown in the legend.781And the thickness of each edge is proportional to the value of Spearman's correlation782coefficients. All edges are grey, which means positive interactions between two fungal783nodes.



784

**Figure 5.** Associations of bacterial (**a**) and fungal (**b**) community structures with soil factors, by Partial Mental test, in different fire histories and different horizons (O and A). Fire histories are recent fires (RF), middle-term fires (MF), old fires (OF) and unfired (UF). All, all environmental factors. The correlations (r) and significance (*p*) are determined with a Bray-Curtis distance matrix and a Euclidean distance matrix for environmental factors, controlled with spatial variation. Different colors in the cells indicate different mantel statistic correlations (r), shown in the legend. The *p* values in the cells with \*, \*\* and \*\*\* indicate *p* < 0.05, *p* < 0.01, *p* < 0.001, respectively. Significance for each test is calculated from 9999 randomized Monte Carlo runs.



Figure 6. Fire legacy effect on bacterial (a) and fungal (b) community structures of the burnt soil in O horizon. Best-fitted structural equation
 models depicting the major pathways of fire, charcoal and representative environmental variables on microbial community structures. The
 bacterial and fungal community structures of charcoal and soil represented by the first axis of NMDS. DOC, dissolved organic carbon; TN, total
 nitrogen content; TP, total phosphorus content; Fire, time since fire. R<sup>2</sup> values denote the amount of variance explained by the model. Solid (blue)

- and dashed arrows (red) indicate positive and negative effects, respectively. Arrow thickness is proportional to the standardized coefficients (std.
- coeff.), interpreted as the relative importance of effects. Only significant (\*p < 0.05, \*\*p < 0.01, \*\*\*p < 0.001) estimate numbers are noted at
- each arrow. The goodness of fit was satisfactory (n = 31, p value = 0.483, CFI = 1.000, RMSEA = 0.000, SRMR < 0.015).

# 799 Supplementary Information

# 800 Supplementary Methods

- 801 Additional site information
- 802 Soil analyses
- 803 Charcoal hand-picked method
- 804 *References for Supplementary Methods*

# 805 Supplementary Tables

- **Table S1.** Field site information of fire-affected and unaffected soils.
- **Table S2.** Effects of fire history on soil properties in soil O and A horizons.
- **Table S3.** Effects of fire history on the relative abundances (specific OTUs  $\times$  100 / total
- number) of bacterial and fungal phyla in soil O and A horizons.
- **Table S4.** Results from permutational multivariate analysis of variance with Bray-Curtis
- dissimilarity from 82 soil samples.
- **Table S5**. Differential bacterial OTUs in the recent fires (RF) compared with unfired sites in
- 813 O and A horizons.
- Table S6. Differential fungal OTUs in the recent fires (RF), middle-term fires (MF), old
- <sup>815</sup> fires (OF) compared with unfired sites in O and A horizons.
- **Table S7.** Topological properties of networks obtained at the different fire histories and
- 817 different horizons (O and A).
- **Table S8.** Bacterial and fungal community structure association with soil factors by Partial
- 819 Mental test in different fire histories and different horizons (O and A).

# 820 Supplementary Figures

- Figure S1. The study region of 44 sites where samples were collected in the Chinese boreal forest.
- **Figure S2.** Soil properties for unburnt and burnt groups.
- Figure S3. Non-metric multidimensional scaling ordination plot based on Bray-Curtis
- dissimilarity showing changes in soil bacterial (a) and fungal (b) community structures.
- Figure S4. All samples using NMDS ordination based on Bray-Curtis dissimilarity to depict
- <sup>827</sup> fire legacy effect on microbial communities.
- Figure S5. The bacterial co-occurrence networks under recent fires (RF, b), middle-term
- fires (MF, c), old fires (OF, d) and fire-unaffected groups (UF, a) in A horizon.
- **Figure S6.** The fungal co-occurrence networks under recent fires (RF, b), middle-term fires
- (MF, c), old fires (OF, d) and fire-unaffected groups (UF, a) in A horizon.
- **Figure S7.** The general structure of *a priori* structural equation model including all possible
- 833 pathways (1-17).