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Rice husk biochar reduces Cd availability by afecting microbial community activity and structure in Cd‑contaminated soils

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Abstract

Purpose Biochar was used widely to deal with cadmium (Cd) pollution in soils. An indoor incubation experiment to investigate the efects of biochar on the structure and Cd-related functions of soil microbial communities under diferent concentration of Cd stress.

Materials and methods A 180-day soil incubation experiment was performed by applying rice husk biochar (BC). At different time periods, Cd forms, chemical properties, and enzyme activities in soils were determined, and the efects of BC on the structure and function of microbial communities in soils with various Cd concentrations were explored by highthroughput sequencing.

Results and discussion Compared to CK, BC signifcantly facilitated the conversion of bioavailable Cd to residual Cd, especially in medium Cd-contaminated soil where the residual Cd content increased by 76.35%. Biochar also signifcantly enhanced pH, soil organic matter, cation exchange, available phosphorus, rapidly available potassium, and catalase activities, except for ammonium nitrogen content and sucrase activities. PCoA and PERMANOVA revealed that incubation time and pollution levels signifcantly afected bacterial community structure, whereas pollution level was the only variable to signifcantly infuence fungal community structure. According to co-occurrence network analysis, BC addition increased the microbial association in light and heavy Cd-contaminated soils but inhibited in medium Cd-contaminated soil. Moreover, the Cd-related functions of the microbial community predicted by PICRUSt2 suggested that BC signifcantly afected Cd transport-related functions in microbial communities, with higher Cd-contaminated soils showing more prominent expression of functions related to Cd transport. *Pseudomonadota* may have played an important role in the efflux of Cd, while *Chlorofexota*, *Bacillota*, and *Actinomycetota* participated in microbial detoxifcation and *Acidobacteriaota*, *Armatimonadota*, and *Planctomycetota* for Cd tolerance.

Conclusions BC not only efectively immobilized Cd in light and medium Cd-contaminated soil but also improved three soil properties. BC had an insignifcant efect on the microbial community structure in three soils but signifcantly afected the expression of Cd transport-related functions in the microbial communities of three soils.

Keywords Biochar · Soil remediation · Cd form · Cd-related functions

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1 Introduction

Cadmium (Cd) pollution in agricultural land has become a critical issue, resulting from prolonged and unceasing influences of mining, smelting, and sewage irrigation activities in China (Tu et al. [2020](#page-12-0)). Available Cd jeopardizes soil quality and crop yields, posing a threat to human health (Shi et al. [2019;](#page-11-0) Liu et al. [2021](#page-11-1)). In recent years, biochar has been attracting attention due to its excellent characteristics such as high-efficiency Cd stabilization, friendly environment, and improvement of soil fertility (Sun et al. [2021;](#page-11-2) Zhang et al. [2021](#page-12-1); Xu et al. [2022](#page-12-2)).

Biochar possesses a large specifc surface area as well as abundant porous structure, functional groups, and minerals (Godlewska et al. [2017;](#page-11-3) Luo et al. [2020](#page-11-4)), which can transform soil Cd speciation by either directly adsorbing soil Cd^{2+} or inducing changes in soil physicochemical properties and microbial communities (Chen et al. [2018a](#page-11-5); Yang et al. [2017;](#page-12-3) Xu et al. [2022](#page-12-2)). For example, rice straw biochar application significantly increased soil pH, organic matter, cation exchange, and available potassium content in soil, which were negatively correlated with HOAc-extracted Cd (Mei et al. [2022\)](#page-11-6). A metaanalysis also reported that various biochar application efectively decreased Cd availability by 41.1% on average in acidic soil (El-Naggar et al. [2022\)](#page-11-7). However, due to limited adsorption sites, functional groups, and minerals of biochar as well as the various soil properties, biochar's remediating efects in diferent concentration of Cd-contaminated soil would difer too. Previous studies have done a lot of work concerning the efects of biochar on Cd speciation and soil properties etc. mainly in a single level of Cd-contaminated soil, which cannot elaborate its adaptability in a wide range of Cd-contaminated soils.

On the other hand, it has been widely recognized that some Cd-resistant microbes carrying Cd-related functions could cope with Cd pollution stress via adsorption or transformation mechanisms, thereby contributing to the signifcant increase of residual Cd (Tu et al. [2020;](#page-12-0) Xie et al. [2021;](#page-12-4) Ma et al. [2023\)](#page-11-8). Biochar can provide nutrients and suitable living space or toxic substances for soil microorganisms, which may have benefcial or detrimental efects on microorganisms, altering the diversity and structure of the microbial community (Yu et al. [2019;](#page-12-5) Zhang et al. [2021\)](#page-12-1). It was reasonable to infer that soil microbes with Cd-related functions will respond accordingly following biochar application. Nevertheless, the study on the infuence of biochar on soil microbial functions related to Cd transformation under the diferent levels of Cd pollution stress was still limited.

Rice husk represents one of the major agricultural wastes, with a global production of about 260 million tons per year (Zhang et al. [2022](#page-12-6)), which has the potential to be utilized to produce low-cost biochar. In this study, rice husk biochar (BC) was applied to three diferent levels of actual Cdcontaminated soils and incubated for 180 days in an indoor passivation experiment, for the purpose of the following: (1) evaluating the efects of BC on soil cadmium speciation, chemical properties, enzyme activities and microbial community structures; (2) determining the association between cadmium speciation, environmental factors, and microbial communities; (3) exploring the efect of BC on the functions related to Cd transformation in soil and identify the microbial species correlated with these functions.

2 Materials and methods

2.1 Test soils and biochar

The light (0.46 mg/kg), medium (4.18 mg/kg), and heavy (10.01 mg/kg) Cd-contaminated surface soils of agricultural land were sampled from Shaoguan City; all three soils were sandy loam according to soil texture triangle from the US department of agriculture. The soils were air-dried, ground, and sieved to determine their physicochemical properties (Table S1) and subjected to laboratory passivation incubation experiments.

The unpolluted rice husks were cleaned, dried, then crushed in a crusher, and sieved $(< 0.42$ mm). The rice husk powder was placed in a muffle with nitrogen gas and kept at 700 °C for 2 h. Rice husk biochar (BC) was sieved $(< 0.154$ mm). The biochar properties were measured as described by Xu et al. ([2022\)](#page-12-2) (Table S1).

2.2 Incubation experiment

Five percent of rice husk biochar was added to light (LS), medium (MS), and heavy (HS) Cd-contaminated soils, which were named treatment groups (BC). The corresponding control groups (CK) without amending biochars were set up, and the CK was the same as our previous research (Xu et al. [2022\)](#page-12-2). All the treatments were in triplicate. The soils were incubated for 180 days, maintaining maximum feld water holding capacity of 75%. The samples were taken, freeze-dried, and sieved at 10, 25, 40, 55, 70, 100, 130, and 180 days for the determination of soil properties.

2.3 Soil properties

Soil samples were digested with a mixture of $HNO₃-HF-HCl$ of 6:3:2 in a microwave digester to determine the total Cd content in soils. European Community Reference Bureau (BCR) method was used to extract the acid-soluble, reducible, oxidizable, and residual Cd contents of the soil independently (Rauret et al. [1999](#page-11-9)). The Cd content in the digestion solution and the BCR sequential extract were determined by ICP-MS (Perkin Elmer 600X, USA). The following methods were described by Lu ([1999\)](#page-11-10). Soil pH values were obtained by shaking the soil with deionized water 1:2.5 (w/v) and determined with a pH meter. SOM was measured after being oxidized using the $K_2Cr_2O_7-H_2SO_4$ method (Wu et al. [2019](#page-12-7)). Cation exchange capacity (CEC) was determined by the spectrophotometric method. Available nitrogen (AN), phosphorus (AP), and potassium (AK) were analyzed by the universal extract-colorimetric method. Sucrase was determined using the 3,5-dinitrosalicylic acid colorimetric method, and the absorbance was measured at 508 nm, and catalase was measured via potassium permanganate titration.

2.4 High‑throughput sequencing

Fresh soil samples before and after Cd immobilization (10 and 180 days) were feezed at−80° for high-throughput sequencing. The bacterial 16S rRNA gene was amplifed using the 338F/806R primer, while the fungal 18S rRNA gene using ITS1F/ITS2 primer. The amplicon libraries were sequenced using the Illumina Nova 6000 platform from Magigene Biotechnology (Guangzhou, China).

2.5 Statistical analysis

All the treatments had three replicates presented as mean \pm standard deviation. One-way analysis of variance (ANOVA) was performed via SPSS 19.0, followed by Duncan's test (*P*<0.05). Principal coordinates analysis (PCoA) and Permutational multivariate analysis of variance (PERMANOVA) based on Bray–Curtis distance presented diferences in microbial community structure between samples. Co-occurrence network analysis was performed by using the "wgcna" R package for correlation analysis at the OTU level and then visualized by Gephi software for presentation. The correlation between environmental factors and microbial communities were analyzed by the Mantel test. Based on the Kyoto Encyclopedia of Genomes (KEGG) and Protein Homology Group Cluster (COG) databases, a phylogenetic survey of communities was conducted by reconstructing unobserved states (PICRUSt2) to predict Cdrelated functions in microbial communities (Chen et al. [2020a\)](#page-11-11). Relationships between Cd-related functions and dominant bacterial phyla were analyzed by Pearson's correlation analysis.

3 Results and discussion

3.1 Efects of biochar on soil properties

3.1.1 Cd speciation

According to the BCR method, acid-soluble and reducible were the most readily bioavailable; oxidizable was potentially toxic to organisms; residuals were generally considered to be the most stable part, which was not susceptible to transformations and migrations (Rinklebe and Shaheen [2017](#page-11-12)). Compared with CK, the changes of Cd forms showed a consistent pattern in the three soils. The content of acid-soluble and reducible Cd decreased by 0.04–0.63 mg/kg, while residual Cd increased by 0.04–0.90 mg/kg, and the oxidizable Cd did not change significantly (Fig. [1](#page-3-0)). Among them, the addition of biochar resulted in 26.79%, 27.43%, and 13.64% of acid-soluble Cd content lower than the control group in the light (LS), medium (MS), and heavy (HS) Cd-contaminated soils, respectively, but the residual Cd content increased by 19.84%, 76.35%, and 36.42%, respectively (Fig. S1). These results indicated that the immobilization of Cd by rice-husk biochar was more efective in LS and MS than HS, but the Cd in the acid-soluble state decreased in HS with little difference from that in MS (Fig. [1\)](#page-3-0).

Rice husk biochar could convert the acid-soluble Cd to the residual state. The main mechanisms were probably that biochar was able to adsorb Cd^{2+} in soil solution by using its own organic functional groups and inorganic ions (Chen et al. [2018a\)](#page-11-5). At this point, Carboxyl, hydroxyl, and phenolic oxygen-containing functional groups in biochar could be used as adsorption sites to form surface complexes with Cd^{2+} in soil solution, reducing the mobility of Cd in soil (Derakhshan Nejad et al. [2018\)](#page-11-13).

3.1.2 Chemical properties

Except for AN, the application of rice husk biochar signifcantly increased chemical properties such as pH, SOM, CEC, AP, and AK in three soils (Fig. [2\)](#page-4-0). Specifcally, compared to CK, biochar for 180 days of incubation increased the pH value in LS, MS, and HS by 1.88, 0.62, and 0.40 unit, respectively (Fig. [2](#page-4-0)A). This was probably due to the alkaline substances such as carbonates and silicates enriched in the surface of biochar (Gul et al. [2015](#page-11-14)). At the same time, the increase of pH varied as a result of the diference in bufering capacity between diferent soils. The increasing pH in soil could deprotonate soil colloids to promote electrostatic adsorption of Cd^{2+} (Xu et al. [2022](#page-12-2)). Therefore, higher pH values were more favorable for Cd immobilization in soil. Compared with CK, biochar application increased the content of SOM in LS, MS, and HS by 43.57, 32.62, and 34.35 mg/kg, respectively (Fig. [2B](#page-4-0)). This was likely due to the carbon enrichment of biochar. The high organic matter in the soil may promote soil fertility, moisture retention, and complexation reaction between Cd and oxygen-containing functional groups in soil organic matter (Wu et al. [2019](#page-12-7)). The content of organic matter in all three soils tended to decrease with

Fig. 1 Changes in diferent cadmium forms in light (**A**), medium (**B**), and heavy (C) Cd-contaminated soils during incubation. $\Delta =$ content of BC-content of CK. LS, light Cd-contaminated soil; MS, medium Cd-contaminated soil; HS, heavy Cd-contaminated soil; CK, soils without treatment; BC, soils from 5% rice husk biochar treatment

increasing incubation time, which might be caused by the organic matter in the soil consumed by microorganisms for their own growth and reproduction (Ameloot et al. [2013\)](#page-11-15). Compared with CK, biochar increased CEC in LS, MS, and HS by 1.31, 1.24, and 0.39 cmol^{$+/kg$}, respectively

(Fig. [2](#page-4-0)C). This might enhance the ion exchange between cations such as Ca^{2+} , Mg^{2+} , K^+ , and Cd^{2+} in the soil.

Compared to CK, the 180 days incubation with biochar increased the content of AN in LS and HS by 10.17 and 19.71 mg/kg, respectively, but slightly decreased the content of AN in MS by 2.95 mg/kg (Fig. [2](#page-4-0)D). Compared with CK, biochar increased the content of AP in LS, MS, and HS by 10.32, 12.65, and 68.63 mg/kg, respectively (Fig. [2E](#page-4-0)). Meanwhile, biochar also increased the content of AK in LS, MS, and HS by 279.12, 54.49, and 139.21 mg/ kg, respectively (Fig. [2](#page-4-0)F). These results demonstrated that rice husk biochar signifcantly improved soil fertility, especially for AK. In addition, biochar application could also suppress heavy metal toxicity by increasing the content of soil AP and AK, which was benefcial to crop growth (Chen et al. [2020b](#page-11-16)).

3.1.3 Enzyme activity

Compared to CK, the catalase activity in LS, MS, and HS was increased to 0.04, 0.10, and 0.01 mL (0.1 mol/L KMnO₄) h⁻¹ g⁻¹, respectively, after 180 days of incubation (Fig. [2G](#page-4-0)). The increase in catalase activity could relieve the toxic efects of hydrogen peroxide on organisms in the soil, in which it could be an oxidoreductase involving in the detoxifcation of heavy metals (Yang et al. [2016](#page-12-8)). Unlike catalase, biochar promoted sucrase activity in MS with an increment of 2.02 mg C₆H₁₂O₆ g⁻¹d⁻¹, while it had no signifcant efect on sucrase activity in LS and even inhibited sucrase activity in HS with a decrease of 0.61 mg $C_6H_{12}O_6$ $g^{-1}d^{-1}$ (Fig. [2H](#page-4-0)). This was probably due to that sucrase activity at its maximum in acidic soil media, whereas biochar created an alkaline condition not conducive to sucrase activity (Wang et al. [2008](#page-12-9)).

3.2 Efects of biochar on structure of microbial communities

3.2.1 Alpha diversity indexes

Before immobilization, BC had no signifcant efect on Chao1 and Shannon indices in bacterial and fungal communities, except for a significant increase by 1.47% of Shannon for the bacterial community in MS and a signifcant decrease by 15.78% of Chao1 for the fungal community in LS (Fig. [3](#page-5-0)). This indicated that BC before immobilization did not have significant effects on the microbial abundance and diversity in the three soils. With increasing incubation time, bacterial Chao1 and Shannon increased signifcantly in both the control and treatment groups after immobilization, but fungal Chao1 and Shannon showed a decreasing trend (Fig. [3](#page-5-0)). Generally, these groups compete for substrates and ecological niches to colonize, thus as the

Fig. 2 Rice husk biocharinduced changes in soil properties. Δ = content of BC-content of CK. LS, light Cd-contaminated soil; MS, medium Cdcontaminated soil; HS, heavy Cd-contaminated soil; CK, soils without treatment; BC, soils from 5% rice husk biochar treatment

bacterial community increased, the fungal community was suppressed. In addition, fungi favor slightly acidic conditions, whereas most bacteria prefer neutral or slightly alkaline environments (Li et al. [2020,](#page-11-17) [2021\)](#page-11-18).

In LS, bacterial Chao1 decreased by 10.5% and the Shannon index did not fuctuate much compared to CK after 180 days of biochar treatment. The Chao1 and Shannon indices of the fungal community also did not change signifcantly. In MS, bacterial Chao1 and Shanno increased significantly $(P < 0.05)$ by 11.67% and 2.64%, respectively, while their variation in the fungal community was not significantly $(P > 0.05)$ different. In HS, Chao1 and Shannon indexes in both bacterial and fungal communities did not signifcantly change compared to CK. These results suggest that the bacterial abundance and diversity exhibited diferent responses to BC in the three soils, while

Fig. 3 Efects of rice husk biochar on alpha diversity index. LS, light Cd-contaminated soil; MS, medium Cd-contaminated soil; HS, heavy Cd-contaminated soil; CK, soils without treatment; BC, soils from

5% rice husk biochar treatment; B, before immobilization; A, after immobilization

the fungal communities, in contrast, showed no signifcant responses.

3.2.2 Beta diversity

PCoA and PERMANOVA revealed that biochar treatment did not affect bacterial community structure at the phylum and genus levels, but that incubation time and pollution levels exerted significant (*P* < 0.05) influence (Fig. [4](#page-6-0), Table [1](#page-6-1)). Besides, fungal community structure

was only significantly $(P < 0.05)$ influenced by pollution levels. These suggested that the structure of the fungal communities was more stable than the bacterial communities in the three soils and less susceptible to disturbance by the external environment (Zhang et al. [2021](#page-12-1)). Notably, the BC addition minimally affected the structure of the microbial communities in the three soils, this suggested that BC could immobilize Cd, improve soil properties, and minimize disturbance to the native microbial communities.

Fig. 4 Principal coordinate analysis (PCoA) based on Bray– Curtis distance under phylum level. **A** Bacterial community structures in the three soils. **B** Fungal community structures in the three soils. L, light Cdcontaminated soil; M, medium Cd-contaminated soil; H, heavy Cd-contaminated soil; CK, soils without treatment; BC, soils from 5% rice husk biochar treatment

3.2.3 Relative abundance

Species with relative abundance $\geq 1\%$ at the phylum level were shown in Fig. [5.](#page-7-0) The dominant bacterial phyla for all samples were *Pseudomonadota*, *Acidobacteriaota*, *Bacteroidota*, *Chlorofexota*, *Bacillota*, and *Gemmatimonadota*, which accounted for 79.64–95.07% of all phyla (Fig. [5A](#page-7-0)). *Pseudomonadota* are the most dominant phyla in the three soils, especially in LS. After 180 days of incubation, the percentage of Proteobacteria increased for all samples in MS but decreased in HS. BC decreased the relative abundance of *Acidobacteriaota* in LS and HS before immobilization but recovered with increasing incubation time. Compared to before immobilization, the percentage of *Bacteroidota* decreased in the three soils after immobilization, while *Bacillota* exhibited the opposite trend. This indicated that *Bacteroidota* might be advantageous in Cd-contaminated environments, which had been also reported as a typical microorganism in Cd-contaminated soils (Wang et al. [2021](#page-12-10)).

The dominant fungal phyla for all samples were *Unassigned* (24.73–64.26%), *Ascomycota* (24.05–51.85%), which occupied the majority (Fig. [5B](#page-7-0)). After immobilization, *Unassigned* emerged as the dominant phyla with the largest relative abundance share of all samples in MS and HS, while Ascomycota was the dominant phyla in LS. Compared to CK, BC addition led to some variation in the relative abundance of dominant phyla in the three soils, but they remained dominant among all phyla. This indicated that BC may not have exerted a substantial infuence on the structure of the native microbial community in the soil (Fig. [4\)](#page-6-0).

3.2.4 Microbial co‑occurrence network

Microbial community co-occurrence networks were established to investigate the infuence of biochar on the association of microbial communities at the OTU level before and after immobilization (Fig. [6](#page-8-0), Table S2). The modularity indices ranged from 0.69 to 0.79 in all networks were larger than 0.5, which indicated they were highly modular (Wu et al. [2022\)](#page-12-11). Moreover, the average path length ranged from 6.86 to 8.45 in all networks, showing a "small-world" characteristic, which indicated that the perturbation of the external environment would spread faster to affect the whole network and disturb the stability of the network (Dai et al. [2022\)](#page-11-19). Besides, the parameters of average degree, clustering coefficient, and average path length were diferent according to the empirical networks and random networks, which indicated those networks were not connected randomly (Fan et al. [2018\)](#page-11-20).

The nodes and edges increased for all samples in all three soils after immobilization except for the edges in HS (Table S2), indicated that the network became correspondingly more complex with incubation time. The percentage of bacterial nodes was more than fungal nodes, and the percentage increased with increasing incubation

Table 1 Impacts of biochar treatments, pollution levels, and time on the composition of bacterial and fungal communities by PERMANOVA

	Bacteria community						Fungi community					
	Phylum			Genus			Phylum			Genus		
	R^2	Pseudo-F	P	R^2	Pseudo-F	\boldsymbol{P}	R^2	Pseudo-F	\boldsymbol{P}	R^2	Pseudo-F	\boldsymbol{P}
Treatment	0.021	0.733	0.511	0.026	0.921	0.418	0.028	0.972	0.336	0.025	0.852	0.461
Pollution levels	0.476	14.988	0.001	0.280	6.423	0.001	0.295	6.917	0.001	0.371	9.712	0.001
Time	0.195	8.240	0.001	0.460	28.999	0.001	0.067	2.456	0.095	0.047	1.681	0.165

Fig. 5 Relative abundance of dominant bacterial (**A**) and fungal (**B**) communities at the phylum level in three soils. L, light Cd-contaminated soil; M, medium Cd-contaminated soil; H, heavy Cd-contami-

nated soil; CK, soils without treatment; BC, soils from 5% rice husk biochar treatment

time, which suggested the bacterial communities might play a greater role in the network. BC addition increased the proportion of positively correlated edges in LS and MS, likely to promote the synergistic interactions between microbial communities. Compared with CK, BC increased the average degree and clustering coefficient in LS by 1.09 and 0.002 and increased in HS by 18.83 and 0.07 but decreased in MS by 2.81 and 0.01, respectively (Fig. S3, Table S3). These suggested BC addition increased the microbial association in LS and HS but inhibited that in MS (Deng et al. [2012\)](#page-11-21).

3.3 Correlation between environmental factors and microbial communities

According to the Mantel test, the environmental variables sucrase, AN, AP, reducible Cd, oxidizable Cd, and residual Cd were signifcantly correlated with the bacterial communities in LS, while pH, SOM, CEC, and AK changes caused signifcant variations in the structure of the fungal communities (Fig. [7](#page-9-0)A). Except for SOM, CEC, sucrase, AP, and AK, the other seven environmental variables signifcantly infuenced the bacterial community structure in MS, while only pH changes in the fungal community were significantly correlated with their microbial structure (Fig. [7](#page-9-0)B). In HS, all environmental variables caused signifcant changes in bacterial and fungal community structure (Fig. [7](#page-9-0)C).

SOM, CEC, and AK contents were negatively correlated with acid-soluble content in LS, in contrast to a positive correlation with residual Cd content $(P < 0.05)$ (Fig. [7](#page-9-0)A). In MS, CEC, and AK contents showed a signifcant negative correlation with acid-soluble Cd content, while AN content showed a signifcant positive correlation with it (Fig. [7](#page-9-0)B). In HS, acid-soluble Cd content was signifcantly negatively correlated with CEC, AN, AP, and AK contents, while signifcantly positively correlated with sucrase content (Fig. [7](#page-9-0)C).

Fungi: Unassigned Ascomycota Mortierellomycota Others

Fig. 6 Co-occurrence networks of bacteria and fungi taxa in diferent treatments at OTU level in three soils. The node size is proportional to the abundance of taxa, and the nodes flled in blue are bacterial taxa, and in orange are fungal taxa. The edges are colored according to interaction types; positive correlations are labeled with blue and

3.4 Functional prediction of microbial communities

The abundance of Cd-related functions was analyzed utilizing PICRUSt2. The functions included a detoxifcation pump for Cd^{2+} (Zn^{2+}/Cd^{2+} -exporting ATPase), providing energy for Cd^{2+} to cross biofilms via ATP hydrolysis $(H^+$ -transporting ATPase), a major carrier of Cd^{2+} transport (Cobalt-zinc-Cd efflux system protein) and the ability to catalyze Cd^{2+} transport by capturing the energy generated by ATP hydrolysis using the ABC transport system (ABC-2 type transport system ATP-binding protein, ABC-2 type transport system permease protein) (Wong et al. [2009;](#page-12-12) Chen et al. [2020a;](#page-11-11) Szeri et al. [2021](#page-11-22); Tian et al. [2022](#page-12-13)). Additionally, Cd resistance functions were also included.

In the three soils, biochar significantly affected the abundance of the function related to Cd transport (Fig. [8](#page-10-0)). $\text{Zn}^{2+}/\text{Cd}^{2+}$ -exporting ATPase were at the lowest abundance levels in LS and HS before immobilization. The $\text{Zn}^{2+}/$ negative correlations are colored in red. LS, light Cd-contaminated soil; MS, medium Cd-contaminated soil; HS, heavy Cd-contaminated soil; CK, soils without treatment; BC, soils from 5% rice husk biochar treatment

 Cd^{2+} -exporting ATPase contained two Cys residues that bind strongly to Cd^{2+} , which could reduce the toxicity of Cd in microorganisms (Chen et al. [2018b](#page-11-23)). After 180 days of incubation, BC treatment signifcantly increased the abundance of $\text{Zn}^{2+}/\text{Cd}^{2+}$ -exporting ATPase in HS compared to the control but inhibited in LS and MS. Besides, the abundance of the H^+ -transporting ATPase were not significantly diferent in all treatments after immobilization. The abundance of cobalt-zinc-Cd efflux system protein did not signifcantly change in the treatment and control groups before immobilization. BC treatment signifcantly increased the abundance of cobalt-zinc-Cd efflux system protein in MS and HS compared to the control after immobilization, which could be more favorable to the active Cd efflux behavior of the microbial communities in both soils (Tian et al. [2022\)](#page-12-13).

Compared to CK, BC had no signifcant efect on the abundance of ABC-2 type transport system ATP-binding protein and ABC-2 type transport system permease protein

Fig. 7 Correlations between soil properties and microbial communities in light (**A**), medium (**B**), and heavy (**C**) Cd-contaminated soils. LS, light Cd-contaminated soil; MS, medium Cd-contaminated soil; HS, heavy Cd-contaminated soil; the asterisks (*) represent signifcant diferences at the level of $P < 0.05$; the asterisks (**) represent signifcant difer ences at the level of $P < 0.01$; the asterisks (***) represent sig nifcant diferences at the level of *P* <0.001

Fig. 8 The key functions regarding the transport of cadmium predicted by PICRUSt2 software. L, light Cd-contaminated soil; M, medium Cdcontaminated soil; H, heavy Cd-contaminated soil; CK, soils without treatment; BC, soils from 5% rice husk biochar treatment

before and after immobilization, and the abundance was higher in MS. BC significantly reduced the abundance of Cd resistance in LS and MS before immobilization. However, the abundance of Cd resistance increased substantially in the three soils after 180 days of incubation, while rice husk biochar signifcantly increased the abundance of Cd resistance genes in MS and HS, which was consistent with rice husk biochar signifcantly reducing the absolute content of acid-soluble Cd in both soils. The expression of the Cd resistance function was more prominent in medium and heavy Cd-contaminated soils. Overall, the expression of Cd transport-related genes in soil was infuenced by various factors such as biochar treatment, pollution levels, and incubation time.

Furthermore, Pearson correlation was conducted to determine the relationship between Cd transport-related functions and dominated bacterial phylum in Cd-contaminated soils (Fig. S2). *Chlorofexota*, *Bacillota*, and *Actinomycetota* were signifcantly and positively correlated with the abundance of $\text{Zn}^{2+}/\text{Cd}^{2+}$ -exporting ATPase, ABC-2 type transport system ATP-binding protein, and ABC-2 type transport system permease protein, which indicated that these microbial communities were stronger detoxifed by themselves. Moreover, *Pseudomonadota* were signifcantly correlated with the abundance of Zn^{2+}/Cd^{2+} -exporting ATPase, cobaltzinc-Cd efflux system protein, ABC-2 type transport system ATP-binding protein, and ABC-2 type transport system permease protein, especially signifcantly facilitating Cd efflux behaviors in microorganisms. These indicated that the majority of Cd-related functions belonged to the *Actinomycetota* and *Pseudomonadota* (Yan et al. [2020\)](#page-12-14). In addition, the abundance of Cd resistance were also signifcantly and positively linked to *Acidobacteriaota*, *Armatimonadota*, and *Planctomycetota*, which indicated their possible involvement in the transformation of Cd forms in the soils as well.

4 Conclusion

Rice husk biochar (BC) was efective for Cd immobilization, especially in LS and MS. In addition to AN and sucrase, BC signifcantly improved soil properties such as pH, SOM, CEC, AP, AK, and catalase in all three soils. Notably, BC had no significant effect on the structure of microbial communities in the three soils, but incubation time and pollution levels had signifcant efects on bacterial community structure, and the structure of fungal communities was only signifcantly afected by pollution levels. Moreover, BC addition increased the association between microbial communities in LS and HS but inhibited in MS. At the same time, BC signifcantly afected the expression of Cd transport-related functions in the microbial communities of the three soils, and the expression of these functions was more prominent in the soils with heavier Cd pollution. *Pseudomonadota* may have played an important role in the efux of Cd; *Chlorofexota*, *Bacillota*, and *Actinomycetota* in microbial detoxifcation; and *Acidobacteriaota*, *Armatimonadota*, and *Planctomycetota* in Cd tolerance. BC could not only immobilize Cd and improve soil fertility but also not signifcantly disturb the structure of indigenous microbial communities; this made it a better amendment agent for the treatment of Cd -contaminated soil in the future.

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Declarations

Conflict of interest The authors declare no competing interests.

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