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Article:

Xiao, Z, Zhang, Y, Li, G et al. (6 more authors) (2021) Application of pharmaceutical waste sludge compost alters the antibiotic resistome in soil under the Chinese cabbage system. *Journal of Cleaner Production*, 291. 125229. ISSN 0959-6526

<https://doi.org/10.1016/j.jclepro.2020.125229>

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1 There are 8848 words in this paper.

2 **Application of pharmaceutical waste sludge compost alters the**
3 **antibiotic resistome in soil under the Chinese cabbage system**

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23 **Highlights**

- 24 ● Cabbage associated with resistome was measured in amended soils.
- 25 ● ARG profiles in amended soil and phyllosphere of cabbage were closely clustered.
- 26 ● The amendment of compost might improve the accessibility of resistome in the soil especially
27 for the Chinese cabbage system.

28

29 **ABSTRACT**

30 Antibiotic resistance is a global threat posing risks to public health. China, as the largest consumer
31 and producer of antibiotics, is generating a large amount of pharmaceutical waste sludge from the
32 antibiotic manufacturing industry, which has the potential to be released into the environments by
33 anthropogenic activities. Land application of pharmaceutical waste sludge compost (PWSC) is a
34 popular way of PWSC disposal, with large amount of antibiotics might hence be introduced into the
35 soil environments and result in the development of antibiotic resistance genes (ARGs). ARGs in
36 PWSC amended soil-plant systems, their transmission routes and potential ecological risks are still
37 unknown. A high-throughput qPCR chip was used to profile ARGs in Chinese cabbage
38 (Shanghaiqing, *Brassica chinensis* L.) and soils (including phyllosphere, root endosphere,
39 rhizosphere soil, and bulk soil) with PWSC amendment, aiming to study the effect of PWSC
40 application on ARGs soil-plant systems. A total of 249 ARGs and 12 mobile genetic elements
41 (MGEs) were detected in all collected samples. The highest number of detected ARGs was in the
42 soil samples (up to 181) compared to the above and below-ground components of Chinese cabbage.
43 Our results demonstrated the PWSC amendment increased the diversity and normalized abundance
44 of ARGs in the amended soil-Chinese cabbage system. Mantel test and Procrustes analysis revealed

45 the connection between ARG profiles and microbial communities (fungal and bacterial
46 communities). Shared ARGs were identified among the Chinese cabbage phyllosphere, Chinese
47 cabbage root, and rhizosphere soils, demonstrating a potential link between antibiotic resistome in
48 Chinese cabbage and soils, with the amended soil as a key source of ARGs in the phyllosphere of
49 Chinese cabbage. In summary, our findings provided novel evidence for a transmission route shared
50 Zero-radius operational taxonomic units (ZOTUs) and ARGs were passed between the soil-Chinese
51 cabbage system elements (i.e., amended soil, root, and phyllosphere) of ARGs from the PWSC
52 amended soils to common green vegetables, highlighting a potential safety hazard of antibiotic
53 resistome transfer from soils to the human food chain.

54

55 **Keywords:** Chinese cabbage; antibiotic resistome; pharmaceutical sludge; compost-amended soil;
56 composting.

57

58 **1. INTRODUCTION**

59 Antibiotic resistance has become notorious in human pathogens (Allen et al., 2010). The spread
60 of antibiotic-resistant bacteria (ARB) in the environment is contributing to the global crisis of
61 clinically relevant antimicrobial resistance (AMR). Environmental pollution of ARB and antibiotic
62 resistance genes (ARGs) can be attributed to commonly use of antibiotics in the animal industry
63 (farm and agricultural industries), which are linked to anthropogenic activities such as intensive use
64 of bio-organic fertilizers (e.g. animal manures and sewage sludge) in the agriculture (Chen et al.,
65 2016; Chen et al., 2017; Cheng et al., 2013; Liu et al., 2019).

66 Appropriate usage of organic fertilizers on farmland can increase soil organic matter content,

67 but offering a pathway to recycle nutrients in the soil (Martínez Salgado et al., 2019). Studies have
68 proved that the unregulated use of untreated organic fertilizers can increase levels of antibiotic
69 resistome in farm settings (Chen et al., 2017; Su et al., 2015; Xie et al., 2016a). These antibiotics
70 and enriched ARGs in farm settings could further transfer from untreated organic wastes to soils
71 and gradually accumulate in vegetation (by absorption from the soil). For instance, supererogatory
72 ARGs were detected in tomato and Chinese cabbage after the use of swine excrement and struvite
73 as a soil amendment (An et al., 2018; Romain et al., 2013). Consumption of green products,
74 particularly raw greens, represents a typical pathway of direct human exposure to the soil
75 microbiome (Chen et al., 2019). ARGs can enter the human food chain or human pathogens via the
76 contaminated plants (e.g. fruits and vegetables) or via horizontal gene transfer (HGT), posing a risk
77 to human health (Amy et al., 2006; Gillings, 2017). China is one of the world's largest producers
78 and consumers of antibiotics (Qiao et al., 2018; Zhang et al., 2015; Zhu et al., 2013). Vast quantities
79 of pharmaceutical waste sludge (PWS) are produced from antibiotic manufacturing and wastewater
80 treatment processes. PWS harbors large amounts of mobile genetic elements (MGEs) and ARGs
81 (Tao et al., 2016), with a number of studies suggesting that PWS harbors more MGEs and ARGs
82 compared with the municipal waste sludge (Liu et al., 2014; Liu et al., 2012; Tong et al., 2017).

83 Waste sludge is often pre-treated before the land application (e.g. via aerobic composting,
84 anaerobic digestion, or sludge carbonization), with aerobic composting widely regarded as an
85 efficient way to minimize chemical and biological hazards from organic wastes (Bernal et al., 2009;
86 Liu et al., 2019; Su et al., 2015).

87 Previous studies have demonstrated that aerobic composting was promoted as an effective
88 means to reduce the concentration of antibiotics and ARGs in waste sludge (Selvam and Wong,

89 2017; Xie et al., 2016b; Zhang et al., 2019). Antibiotic resistome is a resistance reservoir of all the
90 ARGs and precursor genes in the pathogen and nonpathogen. It includes resistance elements carried
91 by both antibiotic-producing bacteria and pathogenic bacteria, and cryptic resistance genes (Wright,
92 2007). Whilst, ARGs can be effectively reduced through composting, the antibiotic resistome will
93 not be eliminated. Using Pharmaceutical Waste Sludge Compost (PWSC) as an organic fertilizer,
94 therefore, represents an underlying origin of human exposure to antibiotic resistome during
95 subsequent consumption of vegetables grown in compost-amended soils.

96 Our understanding of the fate of antibiotic resistome by following the application of composted
97 waste, has seldom been evaluated. In particular, the effect on indigenous soil, root, and phyllosphere
98 antibiotic resistome is a key knowledge gap. It is therefore imperative to elucidate the factors
99 influencing the fate of antibiotic resistome, which follows PWSC application to agricultural land in
100 order to develop effective tactics and technologies to alleviate the rapid spread of antibiotic
101 resistome.

102 High-throughput quantitative PCR (HT-qPCR) with 296 recognized primer sets covering
103 common 12 MGEs and 283 ARGs marker genes in the existing research (Zhu et al., 2013), was
104 employed together with Illumina sequencing of fungi ITS genes and bacterial 16S rRNA genes.
105 Analysis was targeted to: (1) assess the fate of four types of waste compost on the molecular
106 structure of ARGs, bacterial and fungal communities in the soil-Chinese cabbage system; (2)
107 explore the potential migration route of ARGs from the amended soil to Chinese cabbage, and (3)
108 identify the shared MGEs and ARGs between the Chinese cabbage and amended soil by bipartite
109 network analysis. The pot experiment aimed to assess the potential ecological risk of the use of
110 pharmaceutical waste sludge compost. We explored the impacting factors of ARGs in the crops and

111 proposed suggestions for agricultural utilization of pharmaceutical waste sludge compost.

112

113 **2. MATERIALS AND METHODS**

114 *2.1 Properties and Materials*

115 Four types of compost (refer to T1-T3 and S) with a range of characteristics by following
116 production under different composting treatments were used in this pot experiment. Three types of
117 PWSCs (coded T1-T3) were derived from carbon-rich amendments of pharmaceutical sludge
118 compost. Sewage sludge compost (S) was obtained from an online sales platform (Ningbo, China)
119 (Table 1). The PWSCs were air-dried, prior to being used in the experiments. Soils were collected
120 from a vegetable plot (Ningbo, China), which had not received sewage sludge or been amended
121 with other organic manure in the past five years. Prior to use, soils were sieved (mesh size: 2mm)
122 and air-dried. Chemical and physical properties are described in Table 1, including the contents of
123 heavy metals, antibiotics, total carbon, and total nitrogen in the initial samples. Total nitrogen and
124 total carbon were evaluated via dry combustion in a CNS element analyzer (*Vario MAX, Elementar*)
125 (Chen et al., 2017). Concentrations of antibiotics were analyzed by liquid chromatography-mass
126 spectrometry (*LC-MS/MS. XevoG2-SQTOF, Waters*) (details are provided in Supplementary file).
127 The content of heavy metals was determined with inductively coupled plasma- mass spectrometer
128 (*ICP-MS, iCAP Qnova, Thermo Scientific*) after oxidative digestion of samples in sealed microwave
129 digestion tubes (Zhu et al., 2013). The sample pH was determined by preparing a 1:5 solid
130 sample/water (w/v) suspension (*Basic pH Meter, PB-10, Sartorius*). Determination of nitrate and
131 ammonium in the soil was performed using an AA3 Continuous Flow Analytical System (*AA3,*
132 *SEAL Analytical GmbH*) (Wang et al., 2019).

133 2.2 Experiment Design

134 Figure S1A shows a schematic of the experimental design. Each pot consisted of 1kg of soil
135 amended with or without 5% PWSC (w/w, dry weight) (Luo et al., 2016). Five treatments were
136 arranged: untreated soil without fertilizer application (hereinafter called CK), PWSC-T1 amended-
137 soil (hereinafter called T1), PWSC-T2 amended-soil (hereinafter called T2), PWSC-T3 amended-
138 soil (hereinafter called T3), and S amended-soil (hereinafter called S).

139 Each treatment was replicated for three times, giving 15 pots in total (Fig S1A). Soil samples
140 were then planted with Chinese cabbage (Shanghaiqing, *Brassica chinensis* L.) in rhizo-bags to
141 separate the bulk soil from rhizosphere soil. Each rhizo-bag contained 160g soil (30 μ m nylon mesh,
142 4cm diameters, 6cm height), which only allowed the penetration of small molecular weight
143 compounds and prohibited the penetration of plant roots.

144 In this experiment, 14-day-old Chinese cabbage seedlings were potted in the soil and treated
145 with different fertilizer regimes in a greenhouse experiment located at the Institute of Urban
146 Environment, Chinese Academy of Sciences. Each pot was transplanted with 3 plants. Only one
147 plant was kept after survival. The experiment was conducted at room temperature (25-30 °C) with
148 the relative humidity maintained at 70%. On a daily basis, deionized water was used for each pot to
149 maintain the soil water content throughout the experiment. All samples, including bulk soil,
150 rhizosphere soil, root, and Chinese cabbage leaves were collected after 60 days. The plants were
151 harvested at full maturity.

152 All harvested samples were placed into aseptic bags and delivered on ice to the lab promptly
153 after collection. A portion of the soil was sieved (mesh size: 2mm) to determine the selected soil
154 properties and the rest was stored at -80 °C for DNA extraction. Plant samples were brought back

155 to the laboratory immediately for processing (Fig S1B).

156 2.3 Extraction and Purification of DNA Samples

157 DNA was extracted from soil (bulk and rhizosphere soil) according to the operation guide
158 (*FastDNA Spin Kit for Soil (MP Biomedical, CA)*). Phyllosphere DNA was extracted according to
159 previously published methods with slight modifications (Chen et al., 2017; Duran et al., 2018;
160 Marasco et al., 2018).

161 Within 8 hours after harvesting, epiphytic microbes were isolated from the phyllosphere using
162 extensive shaking in sterile water and phosphate buffer (8.5 g L⁻¹ Na₂HPO₄ anhydrous, 6.33 g L⁻¹
163 NaH₂PO₄, and pH = 6.5) added with 0.1% Triton X-100. Flushing liquid was stored as the epiphytic
164 fraction after filtering through 0.22 µm pore size membranes. The extraction for DNA in the filtrate
165 was processed using the *FastDNA Spin Kit for Soil*.

166 Root samples were rinsed with 80% ethanol and 0.25% NaClO to wash living microorganisms
167 of the root surfaces and followed by a sterile water-rinse step three times (at 1 min each). The
168 efficiency of the sterilization was evaluated through culturing on agar medium plates (15 g L⁻¹ agar,
169 3 g L⁻¹ MgSO₄, 10 mL L⁻¹ glycerol, 1.5 g L⁻¹ K₂HPO₄, 10 g L⁻¹ hydrolyzed casein, and 10 g L⁻¹
170 protease peptone for solid medium). The root was treated and homogenized by liquid nitrogen
171 grinding plus. Then DNA was extracted with a *FastDNA Spin Kit for Soil* (Figure S1B).

172 2.4 Microbial Community Profiling

173 The DNA concentration of samples was determined through fluorescence quantitative analysis.
174 Samples were diluted to 20 ng µL⁻¹ for downstream a two-step PCR amplification (Chen et al.,
175 2017). In the first step, the V4-V5 variable region of bacterial *16S rRNA (515F-907R)* (Jing et al.,
176 2015) and *fungus primers (gITS7 - ITS4)* (Ihrmark et al., 2012) were amplified (Table S1).

177 PCR amplification was performed in sterile conditions with technical triplicates. Details of the
178 PCR amplification program and reaction system were presented in Table S2. PCR products were
179 checked on a 1% agarose gel with negative control. Purification was followed for replicated
180 reactions: 1) the bacterial amplicons recovery of purified products was carried out following
181 previous methods (Chen et al., 2019; Zhu et al., 2018); and 2) fungal amplicons were purified using
182 the *Universal DNA Purification kit DP214*.

183 The DNA concentration was measured again with fluorescence quantitation analysis, and
184 pooling 300 ng DNA of each barcoded amplicon in one library for the relevant microbial group.
185 Barcoded amplicons sequencing was implemented with the *Illumina Hiseq2500* platform
186 (*MICROANALY, Hefei, China*).

187 *2.5 16S rRNA Gene and ITS Read Processing*

188 Raw data were pre-processed in *VSEARCH v2.12.0* (Rognes et al., 2016) and *USEARCH v10.0*
189 (Edgar, 2013), Zero-radius operational taxonomic units (ZOTUs) were denoised using the
190 *UNOISE3* (Edgar, 2016) algorithm with a 100% sequence similarity. Double-end amplicon
191 sequences were merged (minimum 50 bp overlap). After removing primers and barcode, chimeras,
192 and quality filtered (largest prospective error threshold of 1.0) were removed with *USEARCH v10.0*,
193 the rest of the high-quality amplicon reads were devoted to downstream analysis. Taxonomical
194 classification based on ZOTUs was performed using *VSEARCH v2.12.0* and the *Silva/UNITE (Silva*
195 *123/UNITE 8.0)* database (Quast et al., 2013).

196 ZOTUs of samples that were in low mass number (< 10 sequence compositions) generally
197 represent a PCR or sequencing error and were removed from the samples. All raw sequences were
198 stored in the public databases (*National Center for Biotechnology Information Sequence Read*

199 *Archive*). That session specification is numbered SRP227163. Alpha-diversity for each sample was
200 profiled through a measurement of Chao1 index, Buzas_gibson index and Shannon_e index, and
201 box plots were described to compare the diversity level of fungal and bacterial ZOTU.

202 2.6 HT-qPCR and Data Analysis

203 SmartChip Real-time PCR system (*Wafergen Inc.*, USA) was employed with HT-qPCR, which
204 is specifically used for large gene expression studies (Wang et al., 2014). Compared with traditional
205 qPCR, this system is a new dedicated high-throughput processing chip, which could greatly
206 accelerate the performance of all the levels. Compared with shotgun metagenomic sequencing, the
207 proposed system is more advantageous than shotgun metagenomic sequencing in operation,
208 analytical method, and absolute quantification analysis, although it might not have a big database
209 (Xiang et al., 2020). Primer sets targeting 283 ARGs, 12 marker genes for mobile genetic elements
210 (MGEs) (Ouyang et al., 2015) including of four universal integron-integrase genes (*intl-1(clinic)*,
211 *intl-1LC*, *intl2*, and *intl3*) and eight transposase genes, and one 16S rRNA gene (Table S5) were
212 included in recent research work (Zheng et al., 2019).

213 The program and reaction system of HT-qPCR amplification was performed as outlined in
214 Table S2. The qPCR results were examined employing SmartChip qPCR Software. Wells with PCR
215 efficiencies are not in the normal range (1.8-2.2) or with multiple melting peaks were removed.
216 Then, according to eq 1, the amplification efficiency was converted to 2. Each experiment was
217 conducted and repeated three times and a detectable threshold cycle (CT) limit value was set to 31
218 (Zhu et al., 2013).

219 In the end, a valid value was determined only if all the repeated trials had amplification. The
220 normalized copy number of MGEs and ARGs was measured and transformed to absolute gene copy

221 numbers and normalized to 16S rRNA gene copy numbers, which were quantified respectively from
222 the Wafergen platform (eq 2) (Chen et al., 2016). To minimize error as a result of differences in 16S
223 rRNA gene abundance between samples, a normalized copy number of ARGs per bacterial cell were
224 used and calculated as follows (eq 3). (Klappenbach et al., 2001; Stalder et al., 2014; Zhu et al.,
225 2018)

$$226 \quad C_T = C_T' \log_2 E \quad (\text{eq1})$$

$$227 \quad \text{Relative Gene Copy Number} = 10^{(31 - C_T)/(10/3)} \quad (\text{eq2})$$

$$228 \quad \text{Normalized copy number of ARG gene} = (\text{Relative ARG gene copy number} / \text{Relative 16S rRNA} \\ 229 \quad \text{gene copy number}) \times 4.1 \quad (\text{eq3})$$

230 Where C_T means the threshold value, 4.1 represents the average number of 16S rRNA gene per
231 bacterium, the related calculation is applied according to the Ribosomal RNA Operon Copy Number
232 Database

233 2.7 Statistical Analysis

234 All data analyses in the plots that follow (e.g. box plots) were computed with the default
235 settings of ggplot2 (Hadley Wickham et al., 2016) for the software R (R Team, 2010). Statistical
236 correlation analysis (Spearman's correlation) was undertaken through SPSS software (PASW
237 Statistics 18.0). A co-association network of ARGs was performed using R with the psych packages
238 and igraph (Adair et al., 2018; Csardi and Nepusz, 2006). Visualized bipartite network analysis was
239 based on Gephi.

240 Based on Bray-Curtis distance, the paper makes a PCoA analysis of the ARGs, bacterial, and
241 fungi community profiles. Procrustes analysis and Mantel analysis of correlation between ARGs,
242 bacterial, and fungal communities were used in R package, vegan (Oksanen et al., 2011).

243 3. Results and Discussion

244 3.1 Distribution of MGEs and ARGs in the Soil-Chinese Cabbage System

245 A total of 12 MGEs and 249 ARGs were detected among all samples, which was higher than
246 previously reported for ARGs in soil samples (Chen et al., 2017; Zhang et al., 2019). The diversity
247 of MGEs and ARGs ranged from 25 to 181 in all samples, with phyllosphere (CK) and rhizosphere
248 soil (soil amended with PWSC T3/S) harboring the lowest (25) and the highest (181) detected
249 number of ARGs, respectively. One possible explanation of this result is that the rhizosphere is
250 usually considered as the most active area in plant microbiome and rhizospheric microorganism has
251 the potential of increasing the spread of ARB and ARG around the rhizosphere.

252 A total of 249 ARGs were identified, representing nine types, of which the majority belonged
253 to vancomycin resistance genes, beta-lactams, tetracycline, and MLSB resistance genes (Fig 1). The
254 detection frequency of the initial soil was similar to the CK at the end of the experiment, which was
255 statistically lower than in the soil samples amended with compost (Adonis, $P < 0.05$). After compost
256 incorporated into the soil, diversity of MGEs and ARGs was raised in each sample, including soil,
257 root endophytes, and phyllospheric samples.

258 ARGs were detected by HT-qPCR in all samples. This proved that ARGs generally exist in the
259 environment (D'Costa et al., 2006). The number of ARGs detected in phyllospheric samples was
260 lower than those in the soil and root endophyte samples following amendment with different
261 fertilizer treatments (Fig 1). This could be a result of the fact that the soil bacterial community was
262 in direct contact with the composted material, which contains high levels of antibiotics and ARGs
263 (Zhu et al., 2017). The number of MGEs and ARGs detected in the initial soil and compost samples
264 combined was less than the detected number of MGEs and ARGs in the soil amended with compost.

265 This phenomenon can be well explained by the following two reasons: (1) the application of organic
266 fertilizer effectively facilitated microorganism activity in the soil and then promoted the spread of
267 antibiotic resistance (Zhu et al., 2013), and (2) the antibiotic residues in PWSCs acted as selective
268 agents and enriched ARGs in the soil (Baym et al., 2016; Nolivos et al., 2019).

269 The change of normalized abundance and the absolute abundance of MGEs and ARGs were
270 different in soils amended with different composts. Figure S2 showed the absolute abundance of
271 ARGs in all soil and phyllospheric samples ranged from 6.16×10^8 to 1.68×10^{10} and from $3.06 \times$
272 10^7 to 1.38×10^8 copies g^{-1} solid (dry weight), respectively. It is clear that following compost (T1,
273 T2, T3, and S) amendment, the absolute abundance of ARGs in soil, rhizosphere, and phyllosphere
274 were raised (Fig S2). Compared with CK, the T1 amendment significantly increased ($p < 0.05$) the
275 absolute abundance of ARGs in rhizosphere soil samples, while S amendment significantly raised
276 ($p < 0.05$) ARGs in soil and phyllospheric samples, suggesting that S compost may also have a
277 strong effect on the Chinese cabbage antibiotic resistome (Fig S2). Our results showed that the S-
278 compost consistently resulted in the highest concentration of antibiotic residues as well as the largest
279 number of ARGs (Fig 1 and Table S1), which infers that the antibiotic residues might be responsible
280 for the elevated number of ARGs.

281 Based on the comparison of normalized results of MGEs and ARGs in bacterial cell numbers,
282 we evaluated normalized abundance levels of MGEs and ARGs in the total microbial community
283 (Fig S3). In the bulk soil, compost (T1, T2, T3, and S) applications consistently led to increases in
284 the normalized abundance of MGEs and ARGs (Fig S3). In the rhizosphere soil, root endophytes,
285 and phyllospheric samples, whilst there were differences in the normalized abundance of MGEs and
286 ARGs, the increase in abundance did not always coincide compared with CK (Fig S3). In all samples,

287 the bulk soil harbored a greater resistome than the rhizosphere soil and the absolute abundance of
288 MGEs and ARGs in all soil samples were greater than that in the phyllosphere (Fig 2).

289 Our results were consistent with a previously published research confirming that the
290 rhizosphere was a key area for propagation and spread of antibiotic resistome and horizontal transfer
291 of ARGs (Zhang et al., 2019). Previous studies have postulated that the rhizosphere microbes
292 provide a range of ecosystem services for plants, such as nutrient acquisition, and abiotic stress
293 tolerance (Meena et al., 2017; Mendes et al., 2014).

294 Hence, this study further highlights the importance of studying ARGs and ARB in the
295 rhizosphere. Diverse and abundant ARGs were detected in different environments using different
296 new molecular tools. The metagenomic approach is considered as a feasible method for studying
297 the environmental dimension of antibiotic resistance. For example, Li et al. (2015) identified 260
298 ARG from 6 different typical environment samples including soil, water, sediment, excrement,
299 wastewater biofilm, and sludge. Moreover, diverse ARGs (381 ARG subtypes) were also detected
300 in urban sewage samples from 32 municipal wastewater treatment plants by Su et al. (2017). High-
301 throughput qPCR based ARG chip as another popular approach for studying ARGs in environment,
302 has the advantage of measuring the absolute abundance of ARGs, which provide a more intuitive
303 way to describe the potential risk. We propose combining various alternative methods might have
304 great potentials in providing more comprehensive understanding of ARGs in environments and their
305 dissemination.

306 In addition to the changes in the diversity and abundance of MGEs and ARGs, even ARG
307 subtypes and MGEs turned out to have more variants (interactions) in network analysis (correlation
308 coefficient $> |0.6|$ and P-value < 0.05), mostly in large proportions (Fig S4). Co-occurrence styles

309 among MGEs and ARG subtypes in the soil-Chinese cabbage system were evaluated using network
310 analysis. Network analysis results suggested that the use of composts (T1, T2, T3, and S) might
311 promote the propagation and spread of ARGs by way of HGT (Fig S4, Table S1). Of all networks,
312 the node was considered the “hub”, chiefly meaning the most continually connected or the most
313 abundant node in each network. For example, *vanC2/vanC3* was the hub gene for the network in
314 the control soil-Chinese cabbage system (CK) (Fig S4A), *ermX* was a “hub” gene for the network
315 in T1 amended-soil (Fig S4B), *bla_{CTX-M-01}* was a “hub” gene for the network in T2 amended-soil
316 (Fig S4C), *tetG-01* was a “hub” gene for the network in T3 amended-soil (Fig S4D) and *bla_{IMP-02}*
317 was a “hub” gene for the network in S amended-soil (Fig S4E).

318 Our network analyses also indicated that MGEs co-occurred with diverse ARG subtypes in
319 cabbage-soil systems. Among the detected MGEs, the transposase genes (e.g., *tnpA-01*, *tnpA-02*,
320 *tnpA-04* and *tnpA-05*) and the integrase genes (e.g., *intI-ILC* and *intI-1(clinic)*) showed significant
321 co-occurrence with related ARGs in the S amended soil-Chinese cabbage system, with matching
322 degrees of 30, 33, 32, 32, 30 and 30 (Fig S4E). Bray-Curtis distance and PCoA analysis (Fig S5)
323 indicated that the structure and distribution of ARGs in root endophytes and phyllospheric samples
324 were significantly different from soil samples (Adonis, $P < 0.01$).

325 Network analysis is deemed to be one of the most effective methods to uncover the co-
326 occurrence patterns of MGEs and ARGs (Forsberg et al., 2014; Li et al., 2015). Network analysis
327 carried out in this study, supported previous observations regarding the relationship between ARGs
328 and MGEs (An et al., 2018; Li et al., 2015; Quintela-Baluja et al., 2019). Network analysis also
329 demonstrated that the relationship between ARGs and MGEs became more intertwined and complex
330 following the introduction of compost into the soil eco-system. The ARGs exhibited a complex

331 interaction with the MGEs, resulting in a more uniform deformation compared with the previous
332 study (Liu et al., 2019). Co-occurrence networks represented that there was an "easy correlation"
333 between two genes, but without unequivocal demonstrable evidence of direct association and
334 interaction. It still needs further identifying specific ARGs-MGEs interactions and associates them
335 with microbial community structures and ecological functions.

336

337 *3.2 Microbiota in Soil and Chinese Cabbage Samples*

338 A total of 3,924-69,847 and 2,525-93,570 effective tags were acquired for the bacterial and
339 fungal communities, respectively, through 16S rRNA and ITS amplicon sequencing of all samples.

340 *3.2.1 Bacterial Community*

341 Bacterial community data were further evaluated using the Buzas_gibson and Shannon_e
342 diversity index to explore changes in bacterial diversity. Compared with those of the CK, the
343 Shannon_e and Buzas_gibson indices increased in the soil amended with fertilizer (Fig S6). The
344 Shannon_e and Buzas_gibson indices of the bacterial community were more sensitive to the T2 than
345 that of the other groups (Fig S6). In bulk and rhizosphere soil but not showed the cabbage
346 phyllosphere, alpha diversity of bacterial after application of compost was raised significantly with
347 obvious features ($P < 0.05$) (Fig S6). Calculated alpha diversity revealed samples from the
348 phyllosphere had the lowest bacterial alpha diversity, followed by bulk soil and then rhizosphere
349 soil (Fig S6).

350 The bacterial community structure of the soil (bulk soil and rhizosphere soil) samples at the
351 phylum level was shown in Fig S7A. Firmicutes, Actinobacteria, Acidobacteria, and Proteobacteria
352 were the four dominant phyla in all soil (bulk soil and rhizosphere soil) samples, with their relative

353 abundance accounted for 68.2-79% totally (Fig S7A). At the class level, Bacilli (ranging from 7.88
354 to 18.5%), Acidobacteria (ranging from 8.28 to 16.2%), and Alphaproteobacteria (ranging from 7.4
355 to 15.2%) were the dominant classes of all soil (bulk soil and rhizosphere soil) samples (Fig S7B).

356 3.2.2 Fungal Community

357 Compared with the bulk soil, Chao1 and Richness indices increased in the rhizosphere soil.
358 Comparatively, when amended with T1, T2, T3, and S, the Chao1 index declined by 7.36%-30.60%
359 and 7.49%-15.90% in rhizosphere soil (except for T1) and bulk soil, respectively (Fig S9).

360 In the bulk soil, at the phylum level, the abundance of Ascomycota accounted for 73.93-92.13%
361 of the total composition of all libraries, followed by Chytridiomycota (0.11-20.78%),
362 Basidiomycota (1.00-7.00%), and Zygomycota (0.34-5.58%) (Except for CK). (Fig S10 A) In
363 rhizosphere soil, at the phylum level, the abundance of Ascomycota accounted for 88.9-98.1% of
364 the total composition of all libraries, followed by Zygomycota (0.32-6.57%), Basidiomycota (0.63-
365 4.57%), and Chytridiomycota (0.01-2.02%) (Fig S10 A).

366 In all soil samples, in comparison to the CK, the abundance of Ascomycota increased following
367 the addition of compost, the highest value reached at 36.03% (Fig S10 A). The abundance of
368 Ascomycota in samples from bulk soil had the lowest value, followed by rhizosphere soil (Fig S10
369 A). Meanwhile, those abundance of Basidiomycota and Zygomycota increased by 0.24-0.83%
370 (except for treatment S) and 0.04-6.25%, respectively.

371 In the phyllosphere, compared with the CK, the Chao1 index and Richness increased by 28.42%
372 and 30% respectively in treatments spiked with T3, with minimal changes after the addition of T1,
373 T2, and S (Fig S9 C and D). Ascomycota and Basidiomycota were the dominant fungal community
374 in the phyllosphere and accounted between 68.94- 90.61% of the total composition in all libraries.

375 In comparison to the control treatments, species of Ascomycota were more sensitive to the addition
376 of T1. Consequently, a decrease ranging between 34.51 and 95.38% was observed for
377 Basidiomycota (except for S), while increases between 4.28-41.49% were found for Ascomycota
378 (Fig S10 E).

379 Our findings support previous research, which observed that the addition of fertilizer can affect
380 the composition and structure of the plant rhizosphere fungal and bacterial communities. The
381 additional compost has been shown to positively influence bacterial richness and diversity in soil,
382 and that over time, the bacterial community structure becomes more stable. (Kavamura et al., 2018)

383 Soil microbial communities affect plant growth, resource use efficiency, and health, especially
384 the microbial communities that are picked up according to vegetation to formation the rhizosphere
385 microbiome (Berendsen et al., 2012; Rodrigo et al., 2013). The bacterial and fungal community
386 compositions in phyllospheric samples were similar to the rhizosphere soil samples, particularly at
387 the phylum level (Fig S7, S8, and S10). We can conclude that a certain amount of fungal and
388 bacterial communities, derived from amended soil, subsequently migrated to the vegetable tissue
389 and colonized the endophyte.

390 However, phyllospheric samples, principal fungal and bacterial families were different from the
391 soil samples (Fig S7, S8, and S10). It has been suggested that in comparison to endophyte samples,
392 phyllospheric samples, are more sensitive to the airborne fungal and bacterial community than the
393 soil fungal and bacterial communities, which would also support our findings (Yan et al., 2019). We
394 observed differences in phyllospheric samples and bulk soil samples for the major ARGs detected
395 (aminoglycoside, beta-lactams, and multidrug resistance genes) (Fig 1 and 2). This finding may be
396 ascribed to the unique microbial community composition in the phyllosphere, where particular

397 microbial ZOTUs are able to port only specific types of ARGs (Li et al., 2015).

398 3.3 Pathway of ARGs from PWSC to Phyllosphere

399 Diverse shared ARGs were found among rhizosphere soil (compost amended-soil), root, and
400 Chinese cabbage phyllosphere, and those only detected in individual samples were represented
401 utilizing a bipartite network analysis (Fig 2). Seven categories of ARGs (I-VII) were identified based
402 on the detected sample types, with two categories identified, where the antibiotic resistome was
403 shared between the Chinese cabbage phyllosphere and environment following compost treatment
404 (namely, IV and VI).

405 Cluster IV contained 20 (Fig 2a), 12 (Fig 2b), 1 (Fig 2c), and 18 (Fig 2d) ARGs, respectively,
406 which were detected simultaneously in the Chinese cabbage phyllosphere and root samples. Cluster
407 VI contained 19 (Fig 2a), 15 (Fig 2b), 12 (Fig 2c), and 21 (Fig 2d) ARGs, respectively, which were
408 detected simultaneously in the Chinese cabbage phyllosphere and the amended rhizosphere soil.
409 The genes in these two categories conferred resistance to multidrug, beta-lactamase, aminoglycoside,
410 MLSB, vancomycin, and tetracycline, and were possible candidates for moving resistance from the
411 soil, to the endophyte and phyllosphere. The ARGs in Cluster VII were shared in the middle of three
412 compartments (Chinese cabbage phyllosphere, rhizosphere soil, and root). In PWSC-T1 amended
413 soils, these genes included 69 ARGs and 5 MGEs (*tnpA-02*, *tnpA-04*, *tnpA-05*, *intI-1 (clinic)*, *intI-*
414 *ILC*), most of which conferred multidrug resistance as well as resistance to beta-lactamase,
415 aminoglycoside, MLSB, and tetracycline (Fig 2a).

416 In PWSC-T2 amended soils, these genes included 53 ARGs and 6 MGEs (*tnpA-01*, *intI3*, *tnpA-*
417 *02*, *intI-ILC*, *intI-1(clinic)*, *tnpA-05*), most of which conferred multidrug resistance and resistance
418 to beta-lactamase, sulfonamide, aminoglycoside, and MLSB (Fig 2b). In PWSC-T3 amended soil,

419 these genes included 60 ARGs and 3 MGEs (*intI-ILC*, *intI-1(clinic)*, *tnpA-01*), the majority of which
420 conferred resistance to vancomycin, sulfonamide, aminoglycoside, multidrug, beta-lactamase, and
421 MLSB (Fig 2c). In S amended-soil, these genes included 60 ARGs and 5 MGEs (*tnpA-02*, *tnpA-04*,
422 *intI-ILC*, *intI-1(clinic)*, *tnpA-05*), most of which delivered multidrug resistance as well to
423 aminoglycoside, beta-lactamase and MLSB (Fig 2d). The bipartite network graph of PWSC
424 treatment (T1-T3) revealed a similar layout to the S treatment. However, there were generally fewer
425 shared ARGs clusters between the PWSC amended rhizosphere soil, Chinese cabbage phyllosphere,
426 and root endophyte samples (Fig 2).

427 Our findings provide further evidence that compost amended soil-derived ARGs are a key
428 origin of the antibiotic resistome found in plants (Chen et al., 2017; Zhang et al., 2019; Zhu et al.,
429 2017). To understand further the migration pattern of the PWSC-derived antibiotic resistome to
430 Chinese cabbage tissues and soil. We have illustrated the possible routes in the soil-plant system
431 (Fig 2). The migration of ARGs from amended soil to plant through the plant tissues was accounted
432 for as an inherent route.

433 All categories in the same soil-Chinese cabbage system shared and exchanged ARGs
434 effortlessly across categories, especially the exchange of shared ARGs. For example, in the PWSC-
435 T1 treatment, we found that 121 ARGs were shared between root endophyte and rhizosphere soil.
436 Of most interest were the 74 genes shared solely by rhizosphere soil and Chinese cabbage
437 phyllosphere, which provided clear evidence of ARGs migrating from amended soil to the Chinese
438 cabbage phyllosphere. The specific concern is infections caused by multidrug-resistant gram-
439 positive pathogens. Vancomycin, which is an important medical measure to assure the safe running
440 of the hospital system, is the last line of defense to avoid the hospital infection from complete

441 collapse. Agent resistant genes to vancomycin, except for T1, were not detected in the phyllosphere
442 in this study. A study on biosafety is an important aspect among studies on applying fertilizer of
443 PWSC.

444

445 *3.4 Shared Microbiota and Antibiotic Resistome among Chinese Cabbage and Amended Soil* 446 *Samples*

447 Procrustes analysis and Mantel analysis were used to explore shared ZOTUs associated with
448 the antibiotic resistome composition from Chinese cabbage phyllosphere, root, and rhizosphere soil
449 samples. Our study indicated that ARG profiles were associated with the shared bacterial structures
450 and composition in both the control group and treatment groups, especially for T1 (Fig 3). Further
451 Procrustes analyzes of the ARG profiles and bacterial 16S rRNA gene clustered the samples
452 automatically according to the type of sample, and the foundation of Bray-Curtis dissimilarity
453 metrics, the results offered high accuracy. (Table S3, Fig 3)

454 We also described the fungal communities' roles in the dissemination of ARGs. Our findings,
455 in agreement with previous studies, show that ARG profiles were remarkably associated with the
456 shared fungal structures and composition in both the control group and treatment group. Procrustes
457 analyzes of ARG profiles and fungal ITS gene clustered the samples automatically according to the
458 type of sample, and the foundation of Bray-Curtis dissimilarity metrics fitting the results offered
459 high accuracy (Table S4, Fig 4).

460 Studies have suggested that shared ARGs were found in both the endophytes and phyllosphere
461 of plants cultured in soil amended with manure. For instance, Bai et al. (2015) observed that in terms
462 of taxonomic structure, leaf and root microbiota, were extensively overlapped whilst. Knief et al.

463 (2012) observed that the dinitrogen reductase gene and dinitrogenase gene, were in both the
464 rhizosphere and phyllosphere metagenome, indicating that a functional gene level, these genes were
465 partially overlapping in the leaf and root microbiota.

466 Shared ZOTUs and shared ARGs imply that phyllosphere and root microbiota might
467 interconnect fungal and bacterial communities including antibiotic-resistant microbiota which have
468 the potential to move between the rhizosphere and phyllosphere (Beattie and Lindow, 1999; Ruiz-
469 Pérez et al., 2016). A study has indicated that roots can effectively recruit soil bacteria or fungal
470 communities to colonize the root, allow antibiotic resistome to migrate from the soil into the
471 phyllosphere and roots (Bulgarelli et al., 2012). This might be a key migration path for the antibiotic
472 resistome in organic fertilizer to move into plants, whereby in this process, the roots can act as a
473 bridge. The results showed that shared ZOTUs support the origin of ARGs by a host in the bacterial
474 or fungal communities. Ultimately, the phyllosphere and root endophyte in Chinese cabbage forms
475 their own ARG compositions.

476

477 **4. Conclusions**

478 In summary, this research showed that the application of both PWSCs (T1-T3) and S increased
479 the diversity and absolute abundance of the ARGs in the phyllosphere, root, rhizosphere soil, and
480 bulk soil of Chinese cabbage. ARGs were examined in the Chinese cabbage microbiome and
481 disproportionally distributed in distinguishing parts (e.g. Phyllosphere and root) of Chinese cabbage.
482 Enrichment of Chinese cabbage antibiotic resistome was associated with fungal and bacterial taxa.
483 Based on these findings, we suggested that rhizosphere soil, root, and phyllosphere microbiota
484 might interconnect with microbial communities (fungal and bacterial communities), including

485 antibiotic-resistant microbiota, potentially moving between the rhizosphere and phyllosphere. In
486 this process, we propose that the roots play the role of a bridge.

487 Nevertheless, shared antibiotic resistome in the amended soil-plant system indicates a feasible
488 pathway of ARGs migration into human pathogens and the microbiome via the food chain (e.g.
489 Vegetable and salad). These observations are critical for the assessment of public health risks on
490 Chinese cabbage grown in the soil amendment dealt with PWSCs. Soil utilization of sewage sludge
491 is an important universal method of treating sewage sludge. How to prevent the biological pollution
492 is always a much-discussed problem, especially on the pharmaceutical waste sludge. This research
493 has significant implications for the recycling of pharmaceutical waste sludge, to improve the
494 sustainable agricultural practices and the human health protection.

495

496 **Acknowledgments**

497 This research is based upon the fund supports provided by Ministry of Science and Technology
498 of China (MSTC) with National Key Research and Development Program (2017YFE0119000),
499 National Natural Science Foundation of China (41701564, 41850410497, 41571130063), Science
500 and Technology Project in Suzhou (SNG201613), Natural Science Fund for Colleges and
501 Universities in Jiangsu Province (17KJB610010), Graduate Student Scientific Research Innovation
502 Projects in Jiangsu Province (SJCX17_0674), and Xiamen Bureau of Science and Technology of
503 China (3502Z20193075). Finally, we thank Yi Zhao for her contributions to constructive comments.

504 **References**

505 Adair, K.L., Wilson, M., Bost, A., Douglas, A.E., 2018. Microbial community assembly in wild
506 populations of the fruit fly *Drosophila melanogaster*. *ISME J.* 12(4), 959-972. doi:10.1038/s41396-017-
507 0020-x.
508 Allen, H.K., Donato, J., Wang, H.H., Cloud-Hansen, K.A., Davies, J., Handelsman, J., 2010. Call of the

509 wild: antibiotic resistance genes in natural environments. *Nature Reviews Microbiology*. 8(4), 251-259.
510 doi:10.1038/nrmicro2312.

511 Amy, P., Ruoting, P., Heather, S., Carlson, K.H., 2006. Antibiotic resistance genes as emerging
512 contaminants: studies in northern Colorado. *Environ Sci Technol*. 40(23), 7445. doi:10.1021/es0680156.

513 An, X.L., Chen, Q.L., Zhu, D., Su, J.Q., 2018. Distinct effects of struvite and biochar amendment on the
514 class 1 integron antibiotic resistance gene cassettes in phyllosphere and rhizosphere. *Sci Total Environ*.
515 631-632, 668-676. doi:10.1016/j.scitotenv.2018.03.034.

516 Bai, Y., Muller, D.B., Srinivas, G., Garrido-Oter, R., Potthoff, E., Rott, M., Dombrowski, N., Munch,
517 P.C., Spaepen, S., Remus-Emsermann, M., Huttel, B., McHardy, A.C., Vorholt, J.A., Schulze-Lefert, P.,
518 2015. Functional overlap of the Arabidopsis leaf and root microbiota. *Nature*. 528(7582), 364-369.
519 doi:10.1038/nature16192.

520 Baym, M., Lieberman, T.D., Kelsic, E.D., Chait, R., Gross, R., Yelin, I., Kishony, R., 2016.
521 Spatiotemporal microbial evolution on antibiotic landscapes. *Science*. 353(6304), 1147-1151.
522 doi:10.1126/science.aag0822.

523 Beattie, G.A., Lindow, S.E., 1999. Bacterial colonization of leaves: a spectrum of strategies.
524 *Phytopathology*. 89(5), 353-359. doi:10.1094/PHYTO.1999.89.5.353.

525 Berendsen, R.L., Pieterse, C.M., Bakker, P.A., 2012. The rhizosphere microbiome and plant health.
526 *Trends Plant Sci*. 17(8), 478-486. doi:10.1016/j.tplants.2012.04.001.

527 Bernal, M.P., Alburquerque, J.A., Moral, R., 2009. Composting of animal manures and chemical criteria
528 for compost maturity assessment. A review. *Bioresour Technol*. 100(22), 5444-5453.
529 doi:10.1016/j.biortech.2008.11.027.

530 Bulgarelli, D., Rott, M., Schlaeppi, K., Ver Loren van Themaat, E., Ahmadinejad, N., Assenza, F., Rauf,
531 P., Huettel, B., Reinhardt, R., Schmelzer, E., Peplies, J., Gloeckner, F.O., Amann, R., Eickhorst, T.,
532 Schulze-Lefert, P., 2012. Revealing structure and assembly cues for Arabidopsis root-inhabiting bacterial
533 microbiota. *Nature*. 488(7409), 91-95. doi:10.1038/nature11336.

534 Chen, Q.-L., An, X.-L., Li, H., Zhu, Y.-G., Su, J.-Q., Cui, L., 2017. Do manure-borne or indigenous soil
535 microorganisms influence the spread of antibiotic resistance genes in manured soil? *Soil Biology and*
536 *Biochemistry*. 114, 229-237. doi:10.1016/j.soilbio.2017.07.022.

537 Chen, Q.-L., Ding, J., Zhu, D., Hu, H.-W., Delgado-Baquerizo, M., Ma, Y.-B., He, J.-Z., Zhu, Y.-G., 2019.
538 Rare microbial taxa as the major drivers of ecosystem multifunctionality in long-term fertilized soils.
539 *Soil Biology and Biochemistry*. doi:10.1016/j.soilbio.2019.107686.

540 Chen, Q., An, X., Li, H., Su, J., Ma, Y., Zhu, Y.G., 2016. Long-term field application of sewage sludge
541 increases the abundance of antibiotic resistance genes in soil. *Environ Int*. 92-93, 1-10.

542 Chen, Q.L., An, X.L., Zhu, Y.G., Su, J.Q., Gillings, M.R., Ye, Z.L., Cui, L., 2017. Application of Struvite
543 Alters the Antibiotic Resistome in Soil, Rhizosphere, and Phyllosphere. *Environ Sci Technol*. 51(14),
544 8149-8157. doi:10.1021/acs.est.7b01420.

545 Chen, Q.L., Cui, H.L., Su, J.Q., Penuelas, J., Zhu, Y.G., 2019. Antibiotic Resistomes in Plant
546 Microbiomes. *Trends Plant Sci*. doi:10.1016/j.tplants.2019.02.010.

547 Cheng, W., Chen, H., Su, C., Yan, S., 2013. Abundance and persistence of antibiotic resistance genes in
548 livestock farms: A comprehensive investigation in eastern China. *Environ Int*. 61(4), 1-7.

549 Csardi, G., Nepusz, T., 2006. The Igraph Software Package for Complex Network Research. *Interjournal*
550 *Complex Systems*. 1695.

551 D'Costa, V.M., McGrann, K.M., Hughes, D.W., Wright, G.D., 2006. Sampling the Antibiotic Resistome.
552 *Science*. 311(5759), 374-377. doi:10.1126/science.1120800.

553 Edgar, R.C., 2013. UPARSE: highly accurate OTU sequences from microbial amplicon reads. *Nature*
554 *Methods*. 10(10), 996-998. doi:10.1038/nmeth.2604.

555 Edgar, R.C., 2016. UNOISE2: improved error-correction for Illumina 16S and ITS amplicon sequencing.
556 *bioRxiv*. 081257. doi:10.1101/081257.

557 Forsberg, K.J., Patel, S., Gibson, M.K., Lauber, C.L., Knight, R., Fierer, N., Dantas, G., 2014. Bacterial
558 phylogeny structures soil resistomes across habitats. *Nature*. 509(7502), 612-616.
559 doi:10.1038/nature13377.

560 Gillings, M.R., 2017. Lateral gene transfer, bacterial genome evolution, and the Anthropocene. *Ann N*
561 *Y Acad Sci*. 1389(1), 20-36. doi:10.1111/nyas.13213.

562 Hadley Wickham, Winston Chang, Lionel Henry, Thomas Lin Pedersen, Kohske Takahashi, Claus
563 Wilke, ., K.W., 2016. ggplot2: Create Elegant Data Visualisations Using the Grammar of Graphics. *Book*
564 *of Abstracts*.

565 Ihrmark, K., Bodeker, I.T., Cruz-Martinez, K., Friberg, H., Kubartova, A., Schenck, J., Strid, Y., Stenlid,
566 J., Brandstrom-Durling, M., Clemmensen, K.E., Lindahl, B.D., 2012. New primers to amplify the fungal
567 ITS2 region--evaluation by 454-sequencing of artificial and natural communities. *FEMS Microbiol Ecol*.
568 82(3), 666-677. doi:10.1111/j.1574-6941.2012.01437.x.

569 Jing, X., Sanders, N.J., Shi, Y., Chu, H., Classen, A.T., Zhao, K., Chen, L., Shi, Y., Jiang, Y., He, J.-S.,
570 2015. The links between ecosystem multifunctionality and above- and belowground biodiversity are
571 mediated by climate. *Nature Communications*. 6(1). doi:10.1038/ncomms9159.

572 Kavamura, V.N., Hayat, R., Clark, I.M., Rossmann, M., Mendes, R., Hirsch, P.R., Mauchline, T.H., 2018.
573 Inorganic Nitrogen Application Affects Both Taxonomical and Predicted Functional Structure of Wheat
574 Rhizosphere Bacterial Communities. *Front Microbiol*. 9, 1074. doi:10.3389/fmicb.2018.01074.

575 Klappenbach, J.A., Saxman, P.R., Cole, J.R., Schmidt, T.M., 2001. rrndb: the Ribosomal RNA Operon
576 Copy Number Database. *Nucleic Acids Res*. 29(1), 181-184. doi:10.1093/nar/29.1.181.

577 Knief, C., Delmotte, N., Chaffron, S., Stark, M., Innerebner, G., Wassmann, R., Von, M.C., Vorholt, J.A.,
578 2012. Metaproteogenomic analysis of microbial communities in the phyllosphere and rhizosphere of rice.
579 *ISME J*. 6(7), 1378. doi:10.1038/ismej.2011.192.

580 Li, B., Yang, Y., Ma, L., Ju, F., Guo, F., Tiedje, J.M., Zhang, T., 2015. Metagenomic and network analysis
581 reveal wide distribution and co-occurrence of environmental antibiotic resistance genes. *ISME J*. 9(11),
582 2490-2502. doi:10.1038/ismej.2015.59.

583 Liu, J., Meng, Z., Liu, X., Zhang, X.-H., 2019. Microbial assembly, interaction, functioning, activity and
584 diversification: a review derived from community compositional data. *Marine Life Science &*
585 *Technology*. 1(1), 112-128. doi:10.1007/s42995-019-00004-3.

586 Liu, M., Ding, R., Zhang, Y., Gao, Y., Tian, Z., Zhang, T., Yang, M., 2014. Abundance and distribution
587 of Macrolide-Lincosamide-Streptogramin resistance genes in an anaerobic-aerobic system treating
588 spiramycin production wastewater. *Water Res*. 63, 33-41. doi:10.1016/j.watres.2014.05.045.

589 Liu, M., Ni, H., Yang, L., Chen, G., Yan, X., Leng, X., Liu, P., Li, X., 2019. Pretreatment of swine manure
590 containing β -lactam antibiotics with whole-cell biocatalyst to improve biogas production. *Journal of*
591 *Cleaner Production*. 240. doi:10.1016/j.jclepro.2019.118070.

592 Liu, M., Zhang, Y., Yang, M., Tian, Z., Ren, L., Zhang, S., 2012. Abundance and Distribution of
593 Tetracycline Resistance Genes and Mobile Elements in an Oxytetracycline Production Wastewater
594 Treatment System. *Environ Sci Technol*. 46(14), 7551-7557. doi:10.1021/es301145m.

595 Liu, X., Lendormi, T., Lanoisellé, J.-L., 2019. Overview of hygienization pretreatment for pasteurization
596 and methane potential enhancement of biowaste: Challenges, state of the art and alternative technologies.

597 Journal of Cleaner Production. 236. doi:10.1016/j.jclepro.2019.06.356.

598 Luo, X., Liu, G., Xia, Y., Chen, L., Jiang, Z., Zheng, H., Wang, Z., 2016. Use of biochar-compost to
599 improve properties and productivity of the degraded coastal soil in the Yellow River Delta, China. Journal
600 of Soils and Sediments. 17(3), 780-789. doi:10.1007/s11368-016-1361-1.

601 Martínez Salgado, M.M., Ortega Blu, R., Janssens, M., Fincheira, P., 2019. Grape pomace compost as a
602 source of organic matter: Evolution of quality parameters to evaluate maturity and stability. Journal of
603 Cleaner Production. 216, 56-63. doi:10.1016/j.jclepro.2019.01.156.

604 Meena, K.K., Sorty, A.M., Bitla, U.M., Choudhary, K., Gupta, P., Pareek, A., Singh, D.P., Prabha, R.,
605 Sahu, P.K., Gupta, V.K., Singh, H.B., Krishanani, K.K., Minhas, P.S., 2017. Abiotic Stress Responses
606 and Microbe-Mediated Mitigation in Plants: The Omics Strategies. Front Plant Sci. 8, 172.
607 doi:10.3389/fpls.2017.00172.

608 Mendes, L.W., Kuramae, E.E., Navarrete, A.A., van Veen, J.A., Tsai, S.M., 2014. Taxonomical and
609 functional microbial community selection in soybean rhizosphere. ISME J. 8(8), 1577-1587.
610 doi:10.1038/ismej.2014.17.

611 Nolivos, S., Cayron, J., Dedieu, A., Page, A., Delolme, F., Lesterlin, C., 2019. Role of AcrAB-TolC
612 multidrug efflux pump in drug-resistance acquisition by plasmid transfer. Science. 364(6442), 778-782.
613 doi:10.1126/science.aav6390.

614 Oksanen, J., Blanchet, F.G., Kindt, R., Legendre, P., Minchin, P., 2011. The vegan package: Community
615 Ecology Package. R package version 2.0--2.

616 Ouyang, W.Y., Huang, F.Y., Zhao, Y., Li, H., Su, J.Q., 2015. Increased levels of antibiotic resistance in
617 urban stream of Jiulongjiang River, China. Appl Microbiol Biotechnol. 99(13), 5697-5707.
618 doi:10.1007/s00253-015-6416-5.

619 Qiao, M., Ying, G.G., Singer, A.C., Zhu, Y.G., 2018. Review of antibiotic resistance in China and its
620 environment. Environ Int. 110, 160-172. doi:10.1016/j.envint.2017.10.016.

621 Quast, C., Pruesse, E., Yilmaz, P., Gerken, J., Schweer, T., Yarza, P., Peplies, J., Glockner, F.O., 2013.
622 The SILVA ribosomal RNA gene database project: improved data processing and web-based tools.
623 Nucleic Acids Res. 41(Database issue), D590-596. doi:10.1093/nar/gks1219.

624 Quintela-Baluja, M., Abouelnaga, M., Romalde, J., Su, J.Q., Yu, Y., Gomez-Lopez, M., Smets, B., Zhu,
625 Y.G., Graham, D.W., 2019. Spatial ecology of a wastewater network defines the antibiotic resistance
626 genes in downstream receiving waters. Water Res. 162, 347-357. doi:10.1016/j.watres.2019.06.075.

627 Rodrigo, M., Paolina, G., Raaijmakers, J.M., 2013. The rhizosphere microbiome: significance of plant
628 beneficial, plant pathogenic, and human pathogenic microorganisms. Fems Microbiology Reviews. 37(5),
629 634-663. doi:10.1111/1574-6976.12028.

630 Rognes, T., Flouri, T., Nichols, B., Quince, C., Mahe, F., 2016. VSEARCH: a versatile open source tool
631 for metagenomics. PeerJ. 4, e2584. doi:10.7717/peerj.2584.

632 Romain, M., Andrew, S., Yuan-Ching, T., Roger, M., Lyne, S., Yun, Z., Edward, T., 2013. Impact of
633 manure fertilization on the abundance of antibiotic-resistant bacteria and frequency of detection of
634 antibiotic resistance genes in soil and on vegetables at harvest. Applied & Environmental Microbiology.
635 79(18), 5701-5709. doi:10.1128/AEM.01682-13.

636 Ruiz-Pérez, C.A., Restrepo, S., Zambrano, M.M., 2016. Microbial and Functional Diversity within the
637 Phyllosphere of Espeletia sp. in an Andean High Mountain Ecosystem. Applied & Environmental
638 Microbiology. 82(6), 1807. doi:10.1128/AEM.02781-15.

639 Selvam, A., Wong, J.W.C., 2017. Degradation of Antibiotics in Livestock Manure During Composting.
640 267-292. doi:10.1016/b978-0-444-63664-5.00012-5.

641 Stalder, T., Barraud, O., Jove, T., Casellas, M., Gaschet, M., Dagot, C., Ploy, M.C., 2014. Quantitative
642 and qualitative impact of hospital effluent on dissemination of the integron pool. *ISME J.* 8(4), 768-777.
643 doi:10.1038/ismej.2013.189.

644 Su, J.Q., An, X.L., Li, B., Chen, Q.L., Gillings, M.R., Chen, H., Zhang, T., Zhu, Y.G., 2017.
645 Metagenomics of urban sewage identifies an extensively shared antibiotic resistome in China.
646 *Microbiome.* 5(1), 84. doi:10.1186/s40168-017-0298-y.

647 Su, J.Q., Wei, B., Ou-Yang, W.Y., Huang, F.Y., Zhao, Y., Xu, H.J., Zhu, Y.G., 2015. Antibiotic resistome
648 and its association with bacterial communities during sewage sludge composting. *Environ Sci Technol.*
649 49(12), 7356-7363. doi:10.1021/acs.est.5b01012.

650 Tao, W., Zhang, X.X., Zhao, F., Huang, K., Ma, H., Wang, Z., Ye, L., Ren, H., 2016. High Levels of
651 Antibiotic Resistance Genes and Their Correlations with Bacterial Community and Mobile Genetic
652 Elements in Pharmaceutical Wastewater Treatment Bioreactors. *Plos One.* 11(6), e0156854.
653 doi:10.1371/journal.pone.0156854.

654 Team, C.R., 2010. Team RDC.R: A Language And Environment For Statistical Computing. R Foundation
655 for Statistical Computing: Vienna, Austria. *Computing.* 14, 12-21.

656 Tong, J., Lu, X., Zhang, J., Sui, Q., Wang, R., Chen, M., Wei, Y., 2017. Occurrence of antibiotic resistance
657 genes and mobile genetic elements in enterococci and genomic DNA during anaerobic digestion of
658 pharmaceutical waste sludge with different pretreatments. *Bioresour Technol.* 235, 316-324.
659 doi:10.1016/j.biortech.2017.03.104.

660 Wang, F.H., Qiao, M., Su, J.Q., Chen, Z., Zhou, X., Zhu, Y.G., 2014. High throughput profiling of
661 antibiotic resistance genes in urban park soils with reclaimed water irrigation. *Environ Sci Technol.*
662 48(16), 9079-9085. doi:10.1021/es502615e.

663 Wang, W., Yang, M., Shen, P., Zhang, R., Qin, X., Han, J., Li, Y., Wen, X., Liao, Y., 2019. Conservation
664 tillage reduces nitrous oxide emissions by regulating functional genes for ammonia oxidation and
665 denitrification in a winter wheat ecosystem. *Soil and Tillage Research.* 194.
666 doi:10.1016/j.still.2019.104347.

667 Wright, G.D., 2007. The antibiotic resistome: the nexus of chemical and genetic diversity. *Nat Rev*
668 *Microbiol.* 5(3), 175-186. doi:10.1038/nrmicro1614.

669 Xiang, Q., Zhu, D., Giles, M., Neilson, R., Yang, X.-R., Qiao, M., Chen, Q.-L., 2020. Agricultural
670 activities affect the pattern of the resistome within the phyllosphere microbiome in peri-urban
671 environments. *J Hazard Mater.* 382, 121068. doi:10.1016/j.jhazmat.2019.121068.

672 Xie, W.Y., McGrath, S.P., Su, J.Q., Hirsch, P.R., Clark, I.M., Shen, Q., Zhu, Y.G., Zhao, F.J., 2016a.
673 Long-Term Impact of Field Applications of Sewage Sludge on Soil Antibiotic Resistome. *Environ Sci*
674 *Technol.* 50(23), 12602-12611. doi:10.1021/acs.est.6b02138.

675 Xie, W.Y., Yang, X.P., Li, Q., Wu, L.H., Shen, Q.R., Zhao, F.J., 2016b. Changes in antibiotic
676 concentrations and antibiotic resistome during commercial composting of animal manures. *Environ*
677 *Pollut.* 219, 182-190. doi:10.1016/j.envpol.2016.10.044.

678 Yan, Z.Z., Chen, Q.L., Zhang, Y.J., He, J.Z., Hu, H.W., 2019. Antibiotic resistance in urban green spaces
679 mirrors the pattern of industrial distribution. *Environ Int.* 132, 105106. doi:10.1016/j.envint.2019.105106.

680 Zhang, J., Lin, H., Ma, J., Sun, W., Yang, Y., Zhang, X., 2019. Compost-bulking agents reduce the
681 reservoir of antibiotics and antibiotic resistance genes in manures by modifying bacterial microbiota. *Sci*
682 *Total Environ.* 649, 396-404. doi:10.1016/j.scitotenv.2018.08.212.

683 Zhang, Q.Q., Ying, G.G., Pan, C.G., Liu, Y.S., Zhao, J.L., 2015. Comprehensive evaluation of antibiotics
684 emission and fate in the river basins of China: source analysis, multimedia modeling, and linkage to

685 bacterial resistance. *Environ Sci Technol.* 49(11), 6772-6782. doi:10.1021/acs.est.5b00729.
686 Zhang, Y.J., Hu, H.W., Chen, Q.L., Singh, B.K., Yan, H., Chen, D., He, J.Z., 2019. Transfer of antibiotic
687 resistance from manure-amended soils to vegetable microbiomes. *Environ Int.* 130, 104912.
688 doi:10.1016/j.envint.2019.104912.
689 Zheng, F., Zhu, D., Giles, M., Daniell, T., Neilson, R., Zhu, Y.G., Yang, X.R., 2019. Mineral and organic
690 fertilization alters the microbiome of a soil nematode *Dorylaimus stagnalis* and its resistome. *Sci Total*
691 *Environ.* 680, 70-78. doi:10.1016/j.scitotenv.2019.04.384.
692 Zhu, B., Chen, Q., Chen, S., Zhu, Y.G., 2017. Does organically produced lettuce harbor higher abundance
693 of antibiotic resistance genes than conventionally produced? *Environ Int.* 98, 152-159.
694 doi:10.1016/j.envint.2016.11.001.
695 Zhu, D., An, X.L., Chen, Q.L., Yang, X.R., Christie, P., Ke, X., Wu, L.H., Zhu, Y.G., 2018. Antibiotics
696 Disturb the Microbiome and Increase the Incidence of Resistance Genes in the Gut of a Common Soil
697 Collembolan. *Environ Sci Technol.* 52(5), 3081-3090. doi:10.1021/acs.est.7b04292.
698 Zhu, Y.G., Johnson, T.A., Su, J.Q., Qiao, M., Guo, G.X., Stedtfeld, R.D., Hashsham, S.A., Tiedje, J.M.,
699 2013. Diverse and abundant antibiotic resistance genes in Chinese swine farms. *Proc Natl Acad Sci U S*
700 *A.* 110(9), 3435-3440. doi:10.1073/pnas.1222743110.

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703 Table 1. Chemical properties of fertilizers and soil.

Items	Soil	PWSC T1	PWSC T2	PWSC T3	S
pH	7.52	7.43	8.06	6.94	8.73
TC	17.74	283.1	242.2	280.5	146.2
TN	2.71	9.45	12.95	11.27	9.59
Cr	78.18	47.73	226.58	36.43	13.35
Cu	34.81	65.53	164.41	229.65	95.38
Pb	38.45	5.87	14.35	1.91	4.08
Zn	132.37	148.85	256.64	320.68	290.66
Cd	0.37	0.48	0.51	0.45	0.45
Tetracycline	-	4.96	3.86	4.06	8.79
Oxytetracycline	-	2.33	1.12	1.97	4.68
Doxycycline	-	2.56	2..13	1.86	3.33
Sulfadiazine	-	0.81	0.31	0.54	0.34
Sulfamethazine	-	0.23	0.12	0.10	0.05
Ciprofloxacin	-	4.32	4.12	3.24	5.66
Enrofloxacin	-	0.32	0.29	0.31	0.51
Chlorotetracycline	-	0.54	0.59	0.48	0.46

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714 Figure 1. The detected MGEs and ARGs in soil samples (including initial soil, rhizosphere soil and
715 bulk soil), Chinese cabbage phyllosphere and compost (including T1, T2, T3 and S). ARGs were
716 classified according to the antibiotic they resisted. Control treatments (CK), PWSCs of T1
717 treatments (T1), PWSCs of T2 treatments (T2), PWSCs of T3 treatments (T3), sewage sludge
718 compost treatments (S) respectively. The mean values of three replicates, data as means \pm SD.

719

720 Figure 2. Bipartite network illustrating the shared genes between Chinese cabbage phyllosphere,
721 root, and rhizosphere soil (compost amended soil) cultured in soil amended with compost (T1 (a),
722 T2 (b), T3 (c) and S (d)).

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724 Figure 3. Procrustes analysis is unveiling the significant association between the absolute abundance
725 of ARGs and shared bacterial taxa composition (16S rRNA gene ZOTUs) relied on the Bray-Curtis
726 distance. a, without the application of manure, b, with application of T1 composting, c, with
727 application of T2 composting, d, with application of T3 composting, e, with application of S
728 composting.

729

730 Figure 4. Procrustes analysis unveiling the significant association between the absolute abundance
731 of ARGs and shared fungal taxa composition (ITS read ZOTUs) relied on the Bray-Curtis distance.

732 a, without application of composting, b, with application of T1 composting, c, with application of
733 T2 composting, d, with application of T3 composting, e, with application of S composting.