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Author/s:

Yan, ZZ;Chen, QL;Zhang, YJ;He, JZ;Hu, HW

Title:

Industrial development as a key factor explaining variances in soil and grass phyllosphere microbiomes in urban green spaces

Date:

2020-06-01

Citation:

Yan, Z. Z., Chen, Q. L., Zhang, Y. J., He, J. Z. & Hu, H. W. (2020). Industrial development as a key factor explaining variances in soil and grass phyllosphere microbiomes in urban green spaces. *Environmental Pollution*, 261, <https://doi.org/10.1016/j.envpol.2020.114201>.

Persistent Link:

<https://hdl.handle.net/11343/270171>

Manuscript Details

Manuscript number	ENVPOL_2019_7363_R1
Title	Industrial development shaping soil and grass phyllosphere microbiomes in urban green spaces
Article type	Research Paper

Abstract

Microbiota in urban green spaces underpin ecosystem services that are essential to environmental health and human wellbeing. However, the factors shaping the microbial communities in urban green spaces, especially those associated with turf grass phyllosphere, remain poorly understood. The lack of this knowledge greatly limits our ability to assess ecological, social and recreational benefits of urban green spaces in the context of global urbanization. In this study, we used amplicon sequencing to characterize soil and grass phyllosphere bacterial communities in 40 urban green spaces and three minimally disturbed national parks in Victoria, Australia. The results indicated that urbanization might have shown different impacts on soil and grass phyllosphere microbial communities. The bacterial diversity in soil but not in grass phyllosphere was significantly higher in urban green spaces than in national parks. Principal coordinate analysis revealed significant differences in the overall patterns of bacterial community composition between urban green spaces and national parks for both soil and grass phyllosphere. Industrial development, as represented by the number of industries in the region, was identified as a key driver shaping the bacterial community profiles in urban green spaces. Variation partitioning analysis suggested that industrial factors together with their interaction with other factors explained 20% and 28% of the variances in soil and grass phyllosphere bacterial communities, respectively. The findings highlight the importance of industrial development in driving the spatial patterns of urban microbiomes, and have important implication for the management of microbiomes in urban green spaces.

Keywords	green spaces; urban microbiome; human health; urbanization; phyllosphere
Corresponding Author	Hangwei Hu
Corresponding Author's Institution	University of Melbourne
Order of Authors	Zhen-Zhen Yan, Qinglin Chen, Yujing Zhang, Jizheng He, Hangwei Hu
Suggested reviewers	Yi Luo, Juntao Wang, Xuemei Han, Min Qiao, Jian-Qiang Su

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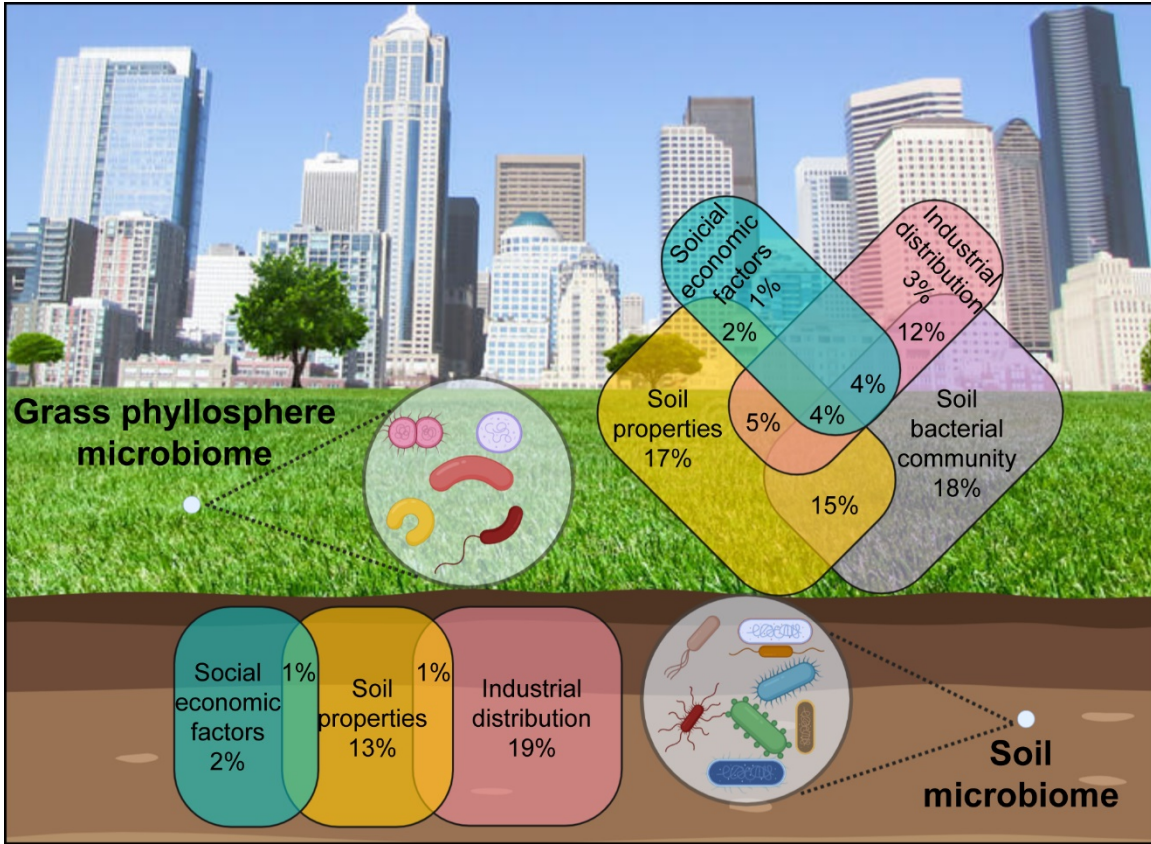
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Highlights

- Urbanization differently impacts soil and grass phyllosphere microbiota.
- Soil bacterial diversity is higher in urban green spaces than national parks.
- Industrial development was a key driver shaping the bacterial communities.

Graphic abstract



Industrial development as a key factor explaining variances in soil and grass phyllosphere microbiomes in urban green spaces

Zhen-Zhen Yan ^a, Qing-Lin Chen ^a, Yu-Jing Zhang ^a, Ji-Zheng He ^a, Hang-Wei Hu ^{a,*}

^a Faculty of Veterinary and Agricultural Sciences, The University of Melbourne, VIC 3010,
Australia

*Corresponding Authors at Faculty of Veterinary and Agricultural Sciences, The University
of Melbourne

Hang-Wei Hu, E-mail: hang-wei.hu@unimelb.edu.au

1 **Abstract**

2 Microbiota in urban green spaces underpin ecosystem services that are essential to
3 environmental health and human wellbeing. However, the factors shaping the microbial
4 communities in urban green spaces, especially those associated with turf grass phyllosphere,
5 remain poorly understood. The lack of this knowledge greatly limits our ability to assess
6 ecological, social and recreational benefits of urban green spaces in the context of global
7 urbanization. In this study, we used amplicon sequencing to characterize soil and grass
8 phyllosphere bacterial communities in 40 urban green spaces and three minimally disturbed
9 national parks in Victoria, Australia. The results indicated that urbanization might have shown
10 different impacts on soil and grass phyllosphere microbial communities. The bacterial diversity
11 in soil but not in grass phyllosphere was significantly higher in urban green spaces than in
12 national parks. Principal coordinate analysis revealed significant differences in the overall
13 patterns of bacterial community composition between urban green spaces and national parks
14 for both soil and grass phyllosphere. Industrial development, as represented by the number of
15 industries in the region, was identified as a key driver shaping the bacterial community profiles
16 in urban green spaces. Variation partitioning analysis suggested that industrial factors together
17 with their interaction with other factors explained 20% and 28% of the variances in soil and
18 grass phyllosphere bacterial communities, respectively. The findings highlight the importance
19 of industrial development in driving the spatial patterns of urban microbiomes, and have
20 important implication for the management of microbiomes in urban green spaces.

21 **Main findings**

- 22 • Urbanization might differently impact soil and grass phyllosphere microbial
23 communities in urban green spaces.

- 24 • Industrial development was a key driver shaping the bacterial community profiles in
25 urban green spaces.
- 26 • The impact of urbanization on the bacterial communities might derive from increased
27 environmental pollution.

28 **Key words:** green spaces, urban microbiome, human health, urbanization, phyllosphere

29 **1. Introduction**

30 Microorganisms, as a vital component of the urban ecosystem, play a critical role in
31 regulating ecosystem services (Eldridge et al., 2019, Hui et al., 2017, Kabisch, 2015), such as
32 pollutant remediation, nutrient cycling and genetic diversity preservation (Escobedo et al.,
33 2011, Groffman et al., 2009, Ramirez et al., 2014, Strohbach and Haase, 2012). These
34 ecosystem functions are important in reducing the growing global burden of urban-associated
35 chronic diseases and maintaining the wellbeing of urban environment and city dwellers.
36 There has been evidence that exposure of humans to microorganisms associated with soil and
37 plants in urban green spaces could reduce the dysfunction of immune system and suppress
38 inflammation (Flies et al., 2017, Flies et al., 2018). During the past several decades, the
39 massive transition of human population from rural to urban living has resulted in dramatic
40 alternations of land use types which may consequently change the environmental habitats for
41 microorganisms (Grimm et al., 2008, Li et al., 2018, Zhu et al., 2011). A better understanding
42 of how anthropogenic disturbance impacts microbial community profiles in the urban
43 environment is essential to prediction and mitigation of the influence of urbanization on
44 ecosystem functioning (Falkowski et al., 2008, Kaye et al., 2005, Reese et al., 2016).

45 Soil and the aerial part (phyllosphere) of turf grass are the two largest habitats for
46 microorganisms in urban green spaces (Crowther et al., 2019, Lindow and Brandl, 2003,
47 Peñuelas and Terradas, 2014, Vorholt, 2012). Urban ecosystem is subject to intensive
48 management practices, and therefore the microbial communities in urban green spaces are not
49 only influenced by environmental factors (e.g. soil properties and climate factors) (Hui et al.,
50 2017, Wang et al., 2018a) but also by anthropogenic activities. Urban environment is
51 considered as a social economic ecosystem (Cadenasso et al., 2007, Pickett et al., 2011)
52 characterized by high human population density and rapid economic growth (Wang et al.,
53 2018a, Zhu et al., 2017). The increasing demand for material by a growing population is

54 usually associated with urban expansion, resulting in an increasing number of industries in
55 the region, which is considered as another important measurement of urbanization (Xu et al.,
56 2014). To date, a few studies have reported that urbanization can substantially change the
57 microbiota in urban green spaces (Francini et al., 2018, Hui et al., 2017, Ramirez et al., 2014,
58 Wang et al., 2018a, Xu et al., 2014), but it remains largely unknown which aspects of
59 urbanization account for the major variance in microbial community profiles in urban green
60 spaces. Additionally, previous studies have mostly focused on the impact of urbanization on
61 soil microbiota but overlooked the plant phyllosphere microbiota despite the significance of
62 phyllosphere as an important environmental habitat for microorganisms. As a vast
63 environment with an estimated area of >1 billion km² across the globe (Vorholt, 2012,
64 Woodward and Lomas, 2004), phyllosphere is described as a formidable playground for
65 testing fundamental ecological principles in microbiology (Meyer and Leveau, 2012). In
66 addition to promoting plant growth and production (Canto and Herrera, 2012, Grady et al.,
67 2019, Taghavi et al., 2009), phyllosphere microbiomes have other important ecosystem
68 functions, for example participating in Earth's biogeochemical cycles through moderating
69 plant ethanol emission and contributing to nitrogen fixation (Galbally and Kirstine, 2002,
70 Fürnkranz et al., 2008). In addition, phyllosphere microbiomes are closely linked to human
71 health as phyllosphere is the potential bridge between environmental microbiome and human
72 microbiome (Chen et al., 2018).

73 In this study, we used Illumina Miseq sequencing to analyse microbial communities
74 in soil and grass phyllosphere samples collected from 40 urban green spaces across the
75 Greater Melbourne metropolitan. As the capital of Australian state Victoria and the second
76 most populous city in Oceania (ABS, 2019), Melbourne is a highly urbanized city with a long
77 legacy of public green space development. In addition, samples from three national parks
78 from remote Victoria were studied as representative of environments with minimal

79 anthropogenic disturbance. Multiple factors including soil properties and anthropogenic
80 parameters were collected to interpret their impacts on the microbial community profiles in
81 urban green spaces. The main aims of this study were to (i) determine the potential
82 differences and links between soil and grass phyllosphere bacterial communities; (ii) compare
83 the bacterial community profiles in highly urbanized environment with those in minimally
84 disturbed natural environment; and (iii) determine the most important factors shaping the
85 bacterial community profiles in urban green spaces.

86 **2. Material and methods**

87 2.1. Sampling

88 Soil and grass samples were collected during May 2018 from 40 urban parks across
89 Greater Melbourne metropolitan and three national parks in remote Victoria, Australia. All
90 samples were collected on sunny or cloudy days with no rainfall event. The daytime
91 temperature during the sample collection period ranged from 12.6 °C to 19.5 °C. At each park,
92 three independent samples for each sample type (i.e. soil and grass) were collected. The
93 surface 5 cm of soil and aerial parts of grass were collected. All samples were immediately
94 transported in sterilized plastic bags on ice to the laboratory after collection. In total, for each
95 sample type, 120 samples were collected from urban green spaces and nine samples were
96 collected from national parks, resulting in a total of 258 soil and grass samples. Detailed
97 information of sampling sites is provided in Table S1. A portion of soil samples were air
98 dried and gently crumbed to pass through a 2 mm sieve for characterization of soil properties.
99 The rest of the samples were stored at -80 °C prior to DNA extraction.

100 2.2. Soil properties characterization

101 Soil pH and electronic conductivity (EC) were measured in 1:5 soil water suspension
102 using Orion Star A215 pH/Conductivity Benchtop Multiparameter Meter (Thermo Scientific

103 Inc., Waltham, MA, USA). Soil cation exchange capacity (CEC) was determined by the
104 concentration of exchangeable bases (Ca^{2+} , Mg^{2+} , Na^+ , and K^+) in 1 M ammonium acetate at
105 pH 7 measured using an Optima 8300 ICP-OES spectrometer (PerkinElmer, Waltham, MA,
106 USA). Soil total carbon (TC) and total nitrogen (TN) were measured by Dumas combustion
107 method using LECO FP628 analyser (LECO Corp, Michigan, USA). Soil mineral nitrogen
108 including extractable ammonium and nitrate were measured in 1 M KCl solution using Skalar
109 San⁺⁺ continuous flow analyser (Skalar Analytical B.V. Tinststraat, Breda, Netherland).

110 2.3. Anthropogenic parameters collection

111 Anthropogenic parameters of the Statistical Area Level 2 (SA2), in which the
112 investigated urban green spaces are located, were collected from Australia Bureau of Statistic
113 (ABS) website (<https://itt.abs.gov.au/itt/r.jsp?databyregion#/>). SA2s are medium sized
114 statistical area that represent socially and economically interacted communities and
115 significant urban areas in the Australia Statistical Geography Standards. SA2s are primary
116 output regions of ABS non-census and intercensal data (ABS, 2016). In this study, the 40
117 urban green spaces investigated are in 40 SA2s across Greater Melbourne metropolitan
118 without overlap. Data of five anthropogenic parameters were collected, and these parameters
119 were divided into two categories: social economic factors including population density
120 (people km^{-2}) and median equivalised total household income (weekly AU\$); and industrial
121 factors including total number of industries, number of construction and manufacturing
122 industries (Table S2).

123 2.4. DNA extraction and sequencing

124 Soil and grass phyllosphere DNA were extracted using the DNeasy PowerSoil Kit
125 (QIAGEN Pty Ltd., Hilden, Germany). Soil DNA was extracted from 0.25 g soil according to
126 the supplier's manual. Grass phyllosphere DNA was extracted using a previous method

127 (Chen et al., 2017, Zhang et al., 2019) with some modifications. Briefly, 5 g grass was
128 weighted into a 50 ml sterilized centrifuge tube containing 45 ml autoclaved 0.01 M
129 phosphate buffered saline with 0.02% Tween 20. The tubes were shaken at 30 °C and 200
130 rpm for 2 h using a shaking incubator. After shaking, the solution was filtered through a 40
131 µm nylon cell strainer into a new sterilized 50 ml centrifuge tube, and centrifuged at 4500
132 rpm for 30 min. After centrifugation, the supernatant was discarded, and the obtained pellets
133 were transferred into the PowerBead tubes provided by the DNA extraction kit. The quality
134 and concentration of the extracted DNA were assessed by agarose gel electrophoresis and
135 spectrophotometric analysis using a NanoDrop ND2000c spectrophotometer (NanoDrop
136 Technologies, Wilmington, DE, USA).

137 The V3 – V4 hypervariable region of the 16S rRNA gene was amplified using the
138 primer pair 341F and 806R for sequencing (Klindworth et al., 2013). Sequencing was
139 performed on the Illumina Miseq platform at Australian Genome Research Facility. The PCR
140 amplification protocol for the Illumina library generation was as follows: an initial enzyme
141 activation and denaturation at 94 °C for 3 min, followed by 32 cycles of 94 °C for 45 s, 55 °C
142 for 45 s and 72 °C for 90 s with a final extension at 72 °C for 10 min. After sequencing, the
143 barcode and adaptor sequences were removed, and ambiguous nucleotides and low-quality
144 reads were filtered. The cleaned raw pair-ended sequencing reads were merged using FLASH
145 (Magoč and Salzberg, 2011) and demultiplexed using Quantitative Insight into Microbial
146 Ecology (QIIME) (Caporaso et al., 2010). Operational taxonomic unit (OTU) picking was
147 conducted based on the threshold of 97% similarity level using UCLUST (Edgar, 2010).
148 Chimeric and singleton OTUs, as well as chloroplast and mitochondrial OTUs were removed
149 from the final OTU data set. Taxonomic classification and OTU quantification were
150 performed against Greengenes 16S rRNA database version 13.8 (McDonald et al., 2012).

151 2.5. Statistical analysis

152 All statistical tests were considered significant at $P < 0.05$ level. Bacteria community
153 compositions at the phylum level were visualized using the ‘ggplot2’ (Wickham, 2016)
154 package in R (R Core Team, 2015). Log-transformed relative abundances of dominant genera
155 identified in samples from different parks were present in heatmaps using the ‘pheatmap’
156 package (Kolde, 2012). Venn diagram was used to illustrate the shared and unique bacterial
157 taxa in soil and grass phyllosphere samples using the ‘VennDiagram’ package (Chen and
158 Boutros, 2011). Differences in bacterial α -diversity between soil and grass phyllosphere and
159 samples from urban green spaces and national parks were explored using Mann-Whitney-
160 Wilcoxon test and visualized using the ‘ggplot2’ package (Wickham, 2016). Principal
161 coordinate analysis (PCoA) based on the Bray-Curtis distance was conducted to evaluate the
162 separation of microbial communities using the ‘labdsv’ package (Roberts and Roberts, 2016).
163 Adonis test and variation partitioning analysis (VPA) were conducted using the ‘vegan’
164 package (Oksanen et al., 2013). Significant differences in specific bacterial taxa between urban
165 green spaces and national parks were identified by liner discriminant analysis (LDA) effect
166 size (LEfSe) according to the instructions (<http://huttenhower.sph.harvard.edu/galaxy/root>).
167 The threshold on the LDA logarithmic was set at 2.0 and $\alpha = 0.01$ (Chen et al., 2017). The
168 correlations between microbial community composition at the genus level (first axis values of
169 PCoA analysis) and soil properties and anthropogenic parameters were explored by
170 Spearman’s ranked correlation analysis using the ‘psych’ package (Revelle and Revelle, 2015).
171 P values of the Spearman’s correlation analyses were corrected using Benjamini-Hochberg
172 procedure. Ordinary least square (OLS) regression models were used to determine the linear
173 relationships between microbial community composition and anthropogenic parameters and
174 soil properties, and were visualized using the ‘ggplot2’ package (Wickham, 2016).

175 2.6 Availability of data and materials

176 Raw sequencing data of 16S rRNA gene of the soil and grass phyllosphere samples
177 were deposited in the National Center for Biotechnology Information (NCBI) Sequence Read
178 Archive (SRA) under the accession number of PRJNA549108.

179 **3. Results**

180 3.1. Soil properties

181 Three independent soil samples were collected from each of the 40 urban green spaces.
182 In total, 120 soil samples were characterized for physiochemical properties. The soil properties,
183 including soil pH, EC (ds m^{-1}), CEC (com kg^{-1}), TC (%), TN (%), ammonium (mg L^{-1}) and
184 nitrate (mg L^{-1}) contents are summarised in Table S3. Soil pH ranged from 5.56 to 7.98, and
185 more than 80% of the soils had pH values below 7. Only 23 soil samples were alkaline or
186 alkaline. Soil EC ranged from 0.06 (ds m^{-1}) to 0.91 (ds m^{-1}). In general, nutrients in the soil
187 samples were low with total C and N ranging from 1.70-9.71% and 0.16-0.91%, respectively.

188 3.2. Characteristics of bacterial communities in soil and grass phyllosphere

189 Bacterial community profiles in soil and grass phyllosphere at different taxonomic
190 levels from phylum to genus were characterised. After assembling and quality filtering,
191 8,732,777 and 9,783,785 high quality sequences were obtained for soil and grass phyllosphere
192 samples, respectively. The sequences were clustered into OTUs at 97% similarity level.

193 For soil samples, 1,071,713 OTUs were assembled into 50 phyla, 174 classes, 374
194 orders, 633 families, and 1,246 genera. At the phylum level, Actinobacteria (accounting for
195 40.74% of sequences) were the most abundant phylum detected in soil samples from urban
196 green spaces, followed by Proteobacteria (31.97%) and Acidobacteria (10.48%). (Fig. S1).
197 Soils from national parks were dominated by the phylum Proteobacteria (66.71%) followed by
198 the second and third most abundant phyla of Actinobacteria (13.71%) and Verrucomicrobia
199 (8.44%) (Fig. S1). There was no significant difference between the bacterial community

200 compositions among samples from different urban parks. Soils from all 40 urban parks were
201 dominated by Actinobacteria and Proteobacteria, which accounted for 18.21-56.39% and
202 22.48-41.68% of the sequences of samples from different parks, respectively (Fig. S2A).
203 Compared with soils from urban parks, the dominance of the phylum Proteobacteria was more
204 apparent for soils from national parks. For soil samples from all three national parks,
205 Proteobacteria accounted for more than half of the sequences (Fig. S2A). At the genus level,
206 374 genera were detected in all investigated parks. According to the heatmap showing the
207 abundances of the 48 dominant genera (defined as those accounting for > 5% sequences in each
208 sample (Wang et al., 2018b)), the bacterial communities were dominated by a few genera of
209 the phyla Actinobacteria and Proteobacteria in soil samples from most of the investigated parks
210 (Fig. S3A).

211 For grass phyllosphere samples, 389,809 OTUs were assembled into 40 phyla, 131
212 classes, 260 orders, 456 families and 946 genera. At the phylum level, Proteobacteria
213 (accounting for 77.17% and 72.54% of sequences for samples from urban parks and national
214 parks, respectively), Bacteroidetes (17.99% and 8.77%), and Actinobacteria (2.95% and 8.49%)
215 were the three most abundant phyla for samples from both urban green spaces and national
216 parks (Fig. S1). Only seven phyla were detected in grass phyllosphere from all investigated
217 parks (Fig. S2B). For samples from both urban and national parks, microbial communities were
218 dominated by the phylum Proteobacteria, which accounted for 42.18-95.31% and 63.35-79.45%
219 of sequences, respectively (Fig. S2B). At the genus level, 81 genera were detected in all
220 investigated parks. The abundances of all these genera are presented by heatmap (Fig. S3B).
221 There was no significant difference in the bacterial communities between urban and national
222 parks and among different urban parks. Bacterial communities of grass phyllosphere samples
223 from all the investigated parks were dominated by a few bacterial genera belonging to the phyla
224 Proteobacteria and Bacteroides (Fig. S3B).

225 The shared and and unique bacterial genera in soil and grass phyllosphere sample were
226 explored using the Venn diagram. A total of 855 bacterial genera were detected in both soil
227 and grass phyllosphere samples, 400 genera were detected only in soil samples, and 91 genera
228 only in grass phyllosphere samples (Fig. 1A). The α diversity as revealed by the Shannon index
229 was significantly higher (Mann-Whitney-Wilcoxon test, $P < 0.001$) in the soil than that in the
230 grass phyllosphere (Fig. 1B). PCoA analysis based on the Bray-Curtis distance revealed a
231 significant difference in microbial communities at the genus level between soil and
232 phyllosphere (Adonis test, $P < 0.001$), which were well separated along the PCo1 axis (Fig.
233 1C).

234 3.3. Soil and grass phyllosphere bacterial communities in urban green spaces and national parks

235 The soil from urban green spaces had significantly higher α diversity than those from
236 national parks (Mann-Whitney-Wilcoxon test, $P < 0.001$) (Fig. S4A). There was no significant
237 difference between the α diversity of grass phyllosphere from urban green spaces and national
238 parks (Fig. S4A). The β diversity analysis indicated that the overall compositions of bacterial
239 communities in urban green spaces were distinct from those in national parks for both soil and
240 grass phyllosphere at the genus level (Adonis test, $P < 0.001$) (Fig. S4B).

241 Bacterial taxa that were significantly different between the urban green spaces and
242 national parks were identified by LEfSe analysis and visualized in cladogram (Fig. 2). A total
243 of 29 bacterial taxa were significantly enriched in the soil from urban green spaces ($P < 0.05$),
244 for example, the phyla Actinobacteria, Chloroflexi, Firmicutes, Gemmatimonadetes, and
245 Nitrospira were significantly enriched in soil from urban green spaces (Fig. 2). In contrast, only
246 two bacterial taxa were significantly enriched in soil from national parks (Fig. 2). As for grass
247 phyllosphere, only six bacterial taxa had higher relative abundances in samples from urban
248 green spaces, whereas 19 bacterial taxa belonging to the phyla of Acidobacteria, Chloroflexi,

249 and Verrucomicrobia, as well as Alphaproteobacteria, and Deltaproteobacteria of the phylum
250 Proteobacteria were significantly enriched in samples from national parks (Fig. 2).

251 3.4. Factors shaping the bacterial community compositions in urban green spaces

252 Spearman's ranked correlation analysis revealed that bacterial community
253 compositions in soil and grass phyllosphere were significantly correlated with a range of
254 anthropogenic parameters including population density (people km⁻²), median equivalised total
255 household income (weekly AU\$), and total number of industries ($P < 0.01$) (Table 1). However,
256 only one soil property, soil EC (ds m⁻¹), was significantly correlated with soil bacterial
257 community composition ($P < 0.01$) (Table 1). Similarly, grass phyllosphere bacterial
258 community composition was significantly correlated with various anthropogenic parameters
259 but had no significant correlation with any soil property analysed (Table 1). Similar to the
260 results of correlation analysis, OLS regression model revealed that soil EC was the only soil
261 property significantly linearly correlated with the soil bacterial community composition (Fig.
262 3). Soil properties including soil EC, CEC, TN, and TC were significantly linearly correlated
263 with the bacterial community composition of grass phyllosphere samples (Fig. 3). According
264 to the OLS regression analysis results, all analysed anthropogenic parameters except the
265 number of construction industries were significantly related to soil bacterial community
266 composition (Fig. 4). Similarly, three out of the five analysed anthropogenic parameters
267 including median equivalised total household income, total number of industries, and the
268 number of construction industries were significantly related to the bacterial community
269 composition in grass phyllosphere (weekly AU\$), (Fig. 4).

270 VPA analysis was conducted to decipher the key contributors to the variance in soil and
271 grass phyllosphere bacterial communities in urban green spaces. For soil, the selected variables
272 explained 36% of the variance in bacterial community (Fig. 5A). Soil properties and social

273 economic factors accounted for 13% and 2% of the variance, respectively (Fig. 5A). The
274 interaction between soil properties and social economic factors and industrial factors both
275 explained 1% of the variance (Fig. 5A). Notably, industrial factors individually contributed 19%
276 to the variance, and were the most important factors shaping the soil bacterial community
277 composition (Fig. 5A). For grass phyllosphere, the selected variables explained 89% of the
278 variance in bacterial community (Fig. 5B). Compared to soil, the contribution of anthropogenic
279 parameters to the variance in bacterial community was less apparent for grass phyllosphere.
280 Social economic factors and industrial factors individually explained only 1% and 3% of the
281 variances, respectively (Fig. 5B). Soil related biotic and abiotic factors, including soil microbial
282 community and soil properties, as well as their interactions, explained 50% of the variance in
283 grass phyllosphere bacterial community (Fig. 5B). However, it should be noted that industrial
284 factors still played an unneglectable role in shaping grass phyllosphere bacterial community
285 through interacting with other factors, which explained 25% of the variance (Fig. 5B).

286 **4. Discussion**

287 4.1. Distinct responses of soil and grass phyllosphere bacterial communities to urbanization

288 The impact of urbanization on microbial diversity has received substantial attention,
289 because loss of microbial diversity could potentially lead to serious environmental and human
290 health problems (Philippot et al., 2013, Rook, 2009, Wang et al., 2018b). The significantly
291 higher soil bacterial α diversity in urban green spaces than in national parks (Fig. S4A)
292 indicated that urbanization might lead to an increase in soil bacterial diversity. Other studies of
293 soil microbial diversity in parks of highly urbanized cities have reported similar results. A prior
294 study reported that as a proxy of urbanization, the increase in human population density is
295 associated with the increase in soil bacterial α diversity in urban green spaces in Chicago, USA
296 (Wang et al., 2018a). Another study reported that urban park soils from Shanghai, China had a

297 high bacterial diversity (Wang et al., 2018b). One potential explanation for the higher soil
298 bacterial diversity in urban green spaces could be that, different from soils in national parks
299 with minimal disturbance, soils in urban green spaces are commonly under intensive
300 management. For example, fertilization and irrigation, which may increase the environmental
301 heterogeneity and provide diverse ecological niches for soil microbes, contribute to a higher
302 soil bacterial α diversity. Another key element that could contribute to the elevated level of
303 bacterial diversity in urban environment is environmental pollution. The increase in population
304 density and excessive use of urban land are associated with increased level of various organic
305 and inorganic pollutants (Liang and Yang, 2019), which may also increase the habitat
306 heterogeneity and diversify the nutrient sources, resulting in the elevated bacterial diversity in
307 urban green spaces. However, Xu et al. (2014) suggested that soil bacterial diversity in urban
308 parks in China was not associated with urbanization factors. Multiple factors could lead to the
309 inconsistency in results across different studies, such as differences in laboratory methods,
310 sampling strategies, and sample handling practices. In this case, the range of study area could
311 be one of the main reasons for the discrepancies among study results. This study, Wang et al.
312 (2018a) and Wang et al. (2018b) investigated urban green spaces in only one metropolitan area.
313 However, Xu et al. (2014) collected samples from 16 cities across China. As the largest
314 developing country, the urbanization rate of China is rapid and has increased greatly during the
315 last decade (Liang and Yang, 2019). Therefore, the disagreement among studies could also
316 derive from the different levels of urbanization. The inconsistency in results also indicated the
317 complexity of factors influencing microbial diversity in the urban environment. Therefore, it
318 is necessary to identify the key factors shaping the soil microbiome in the context of
319 urbanization.

320 Different from previous studies focusing on soil microbiome only, this study also
321 investigated the impact of urbanization on the grass phyllosphere microbiome. Phyllosphere is

322 an enormous environment for ecosystem functions that is densely populated by diverse
323 microorganisms (Vorholt, 2012, Woodward and Lomas, 2004). Bacteria, the most dominant
324 group of microorganisms in the phyllosphere, can reach a surprisingly dense population of 10^5
325 bacterial cells per mm^{-2} leaf surface (Remus-Emsermann and Schlechter, 2018). The huge
326 bacterial population in phyllosphere is composed mostly by commensals and beneficial
327 symbionts, but also can include plant pathogens and even human pathogens (Dees et al., 2015,
328 Delmotte et al., 2009, Lindow and Brandl, 2003; Yan et al., 2019). As turf grass is the direct
329 intermedia between human skin microbiome and environmental microbiome, the microbial
330 community in grass phyllosphere in urban green spaces could closely link to the health of urban
331 residents (Chen et al., 2019). Our results suggested that compared to soil microbiome, the
332 impact of urbanization on grass phyllosphere microbiome might be less apparent as there was
333 no significant difference in phyllosphere bacterial α diversity between urban green spaces and
334 remote national parks (Fig. S4A).

335 The significant differences in the bacterial community compositions (β diversity)
336 between urban green spaces and national parks of both soil and grass phyllosphere revealed by
337 PCoA analysis (Fig. S4B) indicated that urbanization could have altered both soil and grass
338 phyllosphere microbial community profiles. However, the responses of soil and grass
339 phyllosphere microbiomes to urbanization are different. According to the LEfSe analysis (Fig.
340 2), more bacterial taxa, including those associated with Actinobacteria, Chloroflexi, and
341 Verrucomicrobia, were significantly enriched in soils from urban green spaces but significantly
342 enriched in grass phyllosphere from national parks.

343 The potential different impacts of urbanization on soil and grass phyllosphere
344 microbiomes could be attributed to the differences between the soil and phyllosphere
345 environments. As the aerial part of plants, phyllosphere is a highly dynamic environment which
346 is subject to frequent fluctuations of various environmental conditions, such as changes in

347 temperature, moisture and UV radiation (Cordovez et al., 2019). All these factors could
348 minimize the impact of urbanization on grass phyllosphere microbiota. Particularly, due to the
349 ephemeral nature of grass, environmental pollutants cannot persist on grass phyllosphere for a
350 long time. These factors could lead to no significant difference in the bacterial diversity
351 between urban green spaces and national parks, and not many bacterial taxa enriched in grass
352 phyllosphere. In contrast, soil is a relatively stable underground environment that is not easily
353 impacted by environmental fluctuations but has a tight dependency on human regulation.
354 Human activities could both directly shift the soil microbial community, for example bring
355 adventitious microorganisms to the soil ecosystem, and indirectly influence soil microbiota by
356 changing soil properties and thus modifying the habitats of microorganisms (Geisen et al.,
357 2019). More importantly, it has been widely reported that environmental organic pollutants are
358 persistent in soil (Jones and De Voogt, 1999, Klánová et al., 2008, Manz et al., 2001, Reid et
359 al., 2000) and could have profound impact on soil microbial community.

360 4.2. Industrial development as an important factor shaping the bacterial communities in urban 361 green spaces

362 We characterized the relationships between soil and grass phyllosphere bacterial
363 community compositions in urban green spaces with a variety of factors including soil
364 properties, social economic factors and industrial factors. Although several soil properties have
365 been identified as key drivers shaping soil microbial community (Wang et al., 2018a, Xu et al.,
366 2014, Yan et al., 2016), in the present study, surprisingly, soil properties were not among the
367 most important factors shaping either soil or grass phyllosphere bacterial community profile.
368 Particularly, soil pH, which has been widely reported to be a primary factor shaping soil
369 microbial community profile (Hu et al., 2013, Xu et al., 2014, Yan et al., 2016), had no
370 significant relationship with bacterial community composition of either sample type as
371 suggested by the correlation (Table 1) and regression (Fig. 3) analyses. In this study, both the

372 soil and phyllosphere bacterial communities in urban green spaces were dominated by
373 Actinobacteria and Proteobacteria. These two bacterial taxa accounted for 72.71 % and 80.12%
374 of bacterial sequences for soil and grass phyllosphere, respectively (Fig. S1). It has been
375 reported that the abundances of these two taxa were not sensitive to soil pH (Xu et al., 2014,
376 Yan et al., 2016). The weak correlation between soil pH and the bacterial community
377 compositions could be attributed to the insensitivity of the dominant bacterial taxa to soil pH.
378 In addition, because of the relatively uniform environmental condition of our sampling range,
379 there was no great variance in soil properties from different sampling sites (Table S3). This
380 suggests that compared with the differences in environmental factors among the sampling sites,
381 the variance in the urbanization degrees of the regions might play a more significant role in
382 shaping the bacterial community profiles. Based on the correlation and regression analyses, we
383 found that anthropogenic changes, including changes in social economic factors and industrial
384 factors, were important drivers shaping both soil and grass phyllosphere bacterial community
385 profiles in urban green spaces.

386 Among the urbanization related anthropogenic changes, industrial development was
387 proposed to be one of the key drivers shaping bacterial community profiles in urban green
388 spaces. For soil, VPA analysis revealed that industrial factors (i.e. the number of industries in
389 the region), which independently explained 19% of the total variance in soil bacterial
390 community (Fig. 5A), was the dominant predictor among all selected variables. For grass
391 phyllosphere, although industrial factors individually explained only 3% of the variance, the
392 interaction between industrial factors and other factors, including social economic factors, soil
393 properties, and soil bacterial community, together explained 25% of the variance in grass
394 phyllosphere bacterial community (Fig. 5B). Such results indicate that industrial development
395 might be a dominant factor in shaping both soil and grass phyllosphere bacterial community
396 profiles. The crucial effect of industrial development on the urban might mainly derive from

397 environmental pollution, which is a major consequence of industrialization (Cherniwchan,
398 2012, Liang and Yang, 2019). Air pollution due to industrial emission is a crucial problem
399 being faced by regions with an increased number of industries (Chauhan and Pawar, 2010, Han
400 et al., 2014), which could have subtle and overt impact on airborne microbial community
401 (Babich and Lighthart, 1974). The replacement of natural land cover with impervious surface,
402 such as cement roads, parking lots, and other constructions, in industrialized area could further
403 contribute to the alternation of airborne bacterial community (Docherty et al., 2018, Mhuireach
404 et al., 2016). The deposition of air particles is highly likely to result in changes in the bacterial
405 community compositions of both surface soil and grass phyllosphere microbiotas in urban
406 green spaces. In addition, heavy metal pollution in the surface soils resulting from industrial
407 wastewater discharge is another key problem faced by regions undergoing industrialization
408 (Dolar et al., 2016, Fiorentino et al., 2019, Hu et al., 2013) which could greatly impact soil
409 microbial communities.

410 **5. Conclusions**

411 In this study, we comprehensively characterized the soil and grass phyllosphere
412 bacterial communities in urban green spaces. Our findings indicated that urbanization could
413 have altered bacterial community profiles, and the alternations were different for below
414 ground (soil) and above ground (grass phyllosphere) microbiomes. Most importantly, we
415 found that compared with soil properties, anthropogenic changes, particularly industrial
416 development may play a more significant role in shaping bacterial community profiles in
417 urban settings. These findings expended our knowledge of the microbiota in urban green
418 spaces and could have important implication for achieving better urban planning and urban
419 green space management practices toward maximising the benefits of urban infrastructure.

420 **Conflict of interest**

421 The authors declare no conflict of interest.

422 **Acknowledgements**

423 This work was financially supported by Australian Research Council (DP170103628).

424 **Appendix A. Supporting data**

425

426 **References**

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- 1 **Table 1.** Spearman's ranked correlation coefficient between soil properties and anthropogenic parameters and microbial community
- 2 compositions (the first axis values of PCoA analysis) in the soil and grass phyllosphere samples from urban green spaces.

	Soil properties						Anthropogenic parameters					
	pH	EC (ds m ⁻¹)	CEC (cmol kg ⁻¹)	Total carbon (%)	Total nitrogen (%)	Ammonium (mg L ⁻¹)	Nitrate (mg L ⁻¹)	Socio-economic factors			Industrial distribution	
Population density (people km ⁻²)								Median equivalised total household income (weekly AU\$)	Total number of industries	Number of construction industries	Number of manufacturing industries	
Soil bacterial community	-0.051	-0.242**	-0.107	0.001	-0.023	0.104	0.155	0.307**	0.266**	0.411*	0.151	0.010
Grass phyllosphere microbial community	0.108	-0.091	0.150	0.105	0.068	-0.011	0.141	0.118	0.238**	0.401**	0.267**	0.172

- 3 ** indicates significant level of $P < 0.01$. Significant correlations are shown in bold text

Legends

Fig. 1. Venn diagram showing the numbers of unique and shared genera in soil and grass phyllosphere samples (A). Boxplots showing the Shannon index (α diversity in soil and grass phyllosphere samples (B)). *** indicates $P < 0.001$ determined by Mann-Whitney-Wilcoxon test. The white squares indicate the mean values. Principal coordinate analysis (PCoA) based on the Bray-Curtis distance showing the distribution patterns of microbiome in soil and grass phyllosphere (β diversity) (C).

Fig. 2. Cladograms of the LEfSe analysis results indicating differences of taxa between soil and grass phyllosphere in urban green spaces and national parks. The red and blue denote the taxon with significantly higher abundance ($\alpha > 0.01$, LDA score > 2.0) in urban green spaces and national parks, respectively. Yellow denotes that taxon not significantly different between urban green spaces and national parks.

Fig. 3. Ordinary least square (OLS) regression model showing the relationships between soil properties and microbial community compositions (the first axis values of PCoA analysis) in soil and grass phyllosphere in urban green spaces.

Fig. 4. Ordinary least square (OLS) regression model showing the relationships between anthropogenic parameters and microbial community compositions (the first axis values of PCoA analysis) in soil and grass phyllosphere in urban green spaces.

Fig. 5. Variation partitioning analysis (VPA) showing the effects of soil properties, soil bacterial communities, social economic factors and industrial factors on the alternation of soil (A) and grass phyllosphere microbial communities(B).

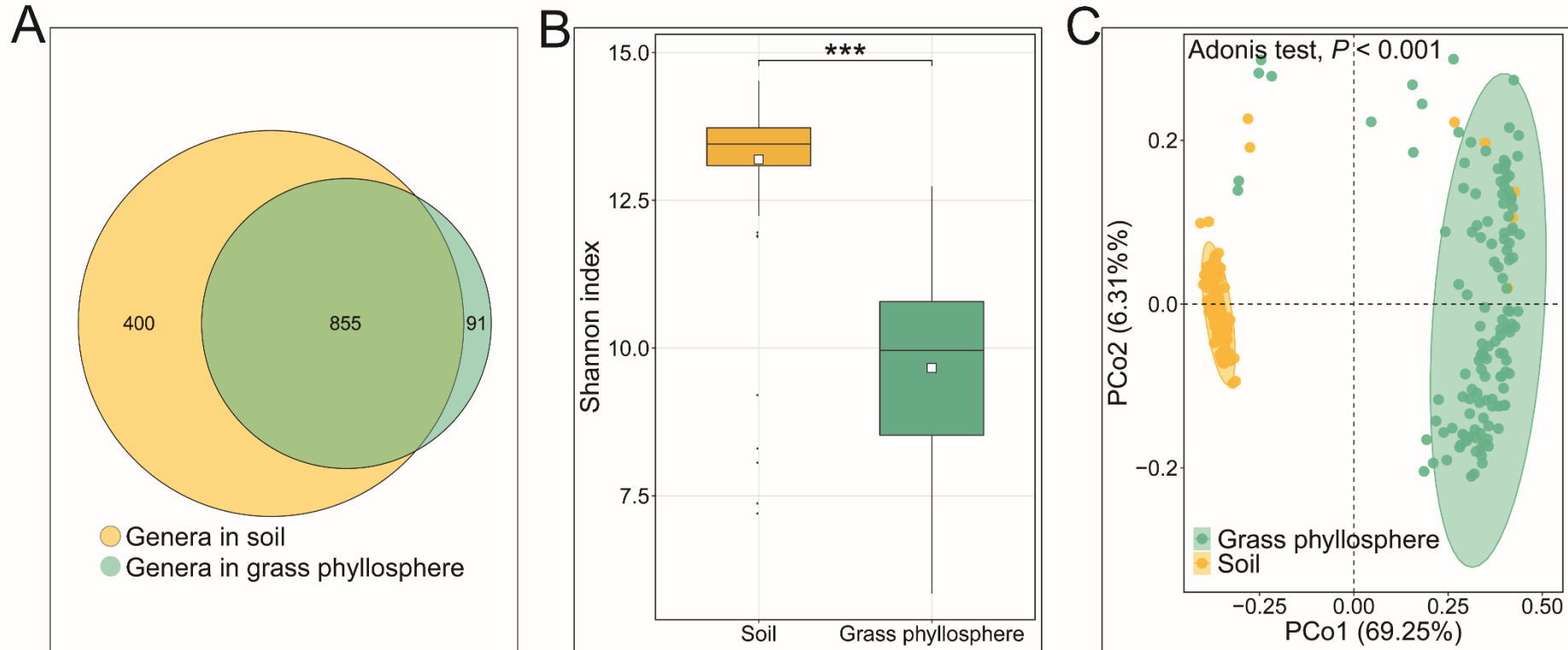


Fig. 1. Venn diagram showing the numbers of unique and shared genera in soil and grass phyllosphere samples (A), boxplots showing the Shannon index (α diversity in soil and grass phyllosphere samples. *** indicates $P < 0.001$ determined by Mann-Whitney-Wilcoxon test. The white squares indicate the mean values (B). and principal coordinate analysis (PCoA) based on the Bray-Curtis distance showing the distribution patterns of microbiome in soil and grass phyllosphere (β diversity) (C).

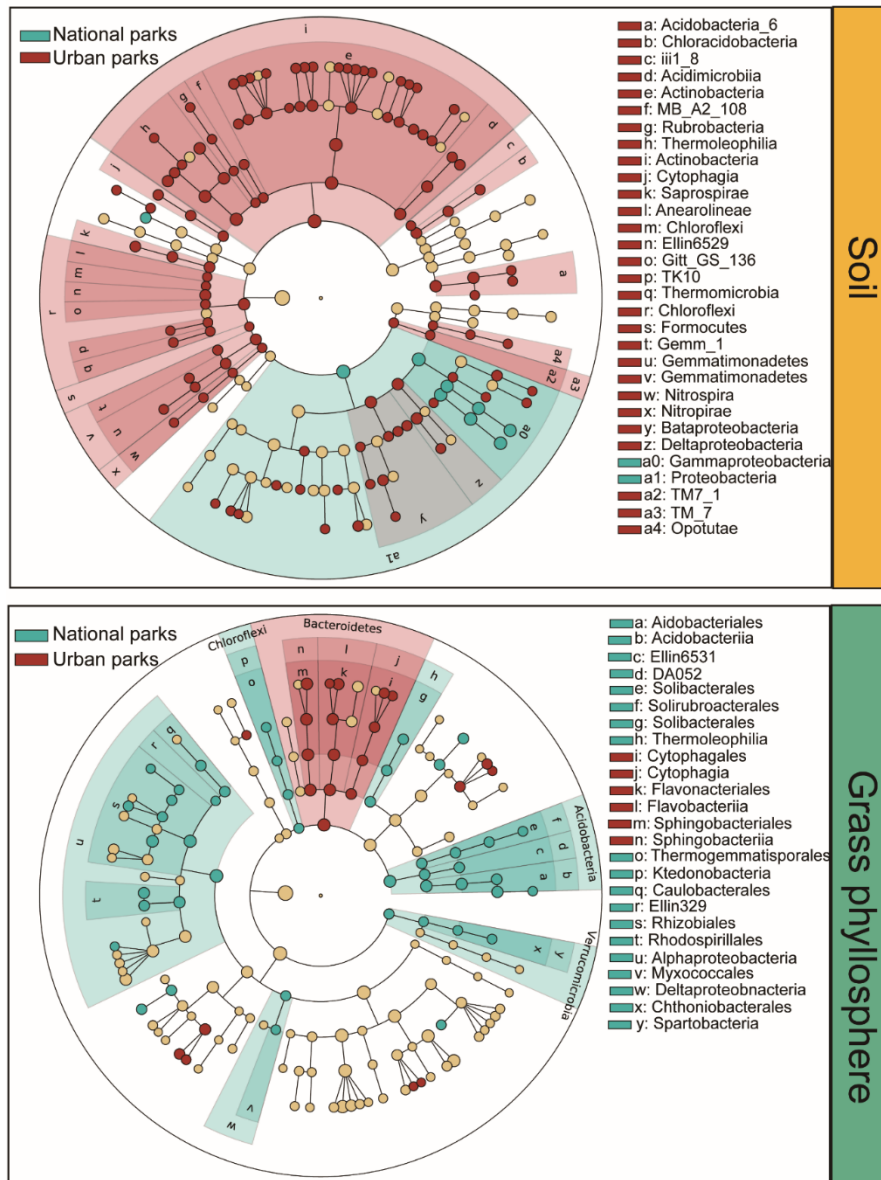


Fig. 2. Cladograms of the LefSe analysis results indicating differences of taxa between soil and grass phyllosphere in urban green spaces and national parks. For each taxon, the red and blue denote the significantly higher abundance ($\alpha > 0.01$, LDA score > 2.0) in urban green spaces and national parks, respectively. Yellow denotes that taxon not significantly different between urban green spaces and national parks.

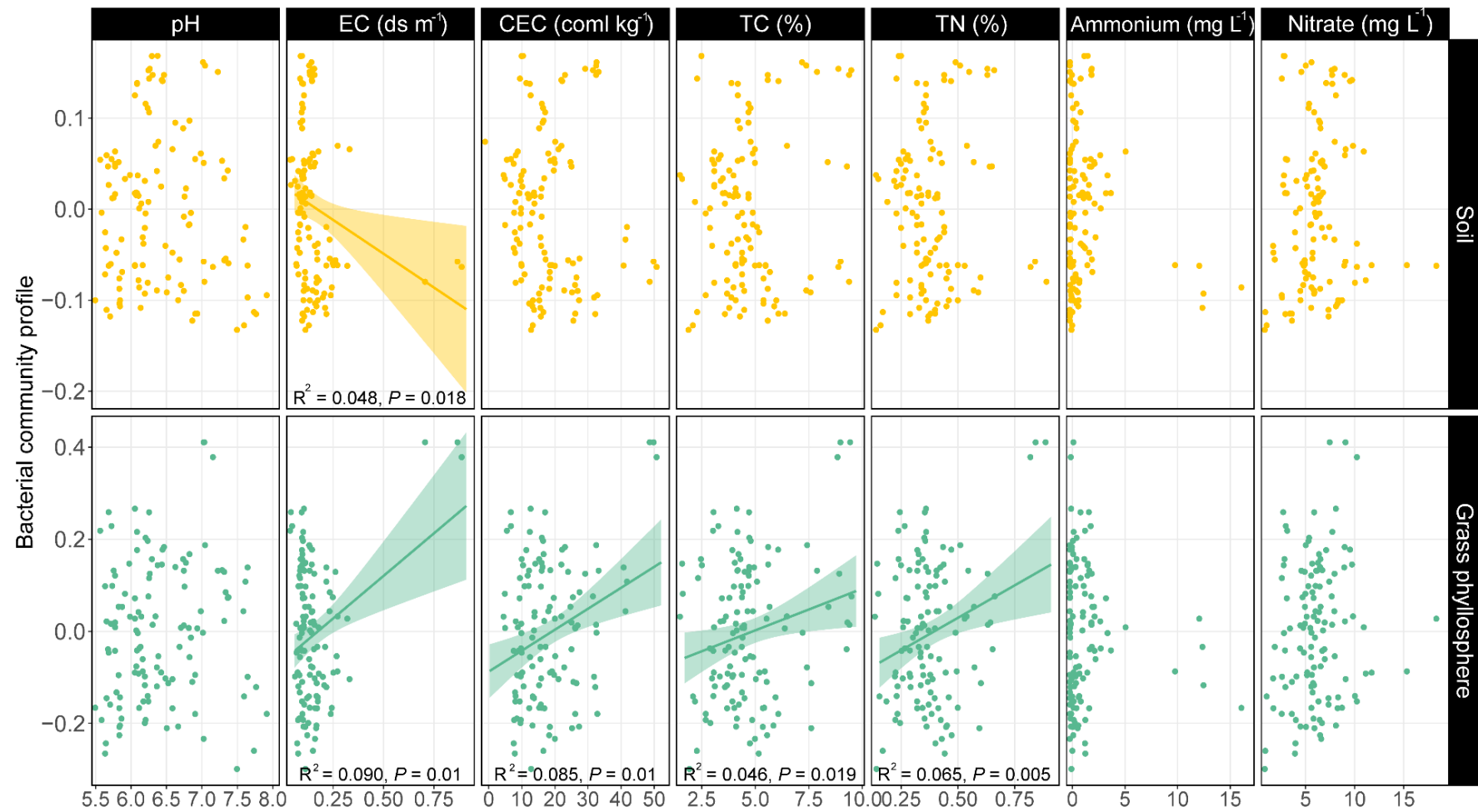


Fig. 3. Ordinary least square (OLS) regression model showing the relationships between soil properties and microbial community compositions (the first axis values of PCoA analysis) in soil and grass phyllosphere in urban green spaces.

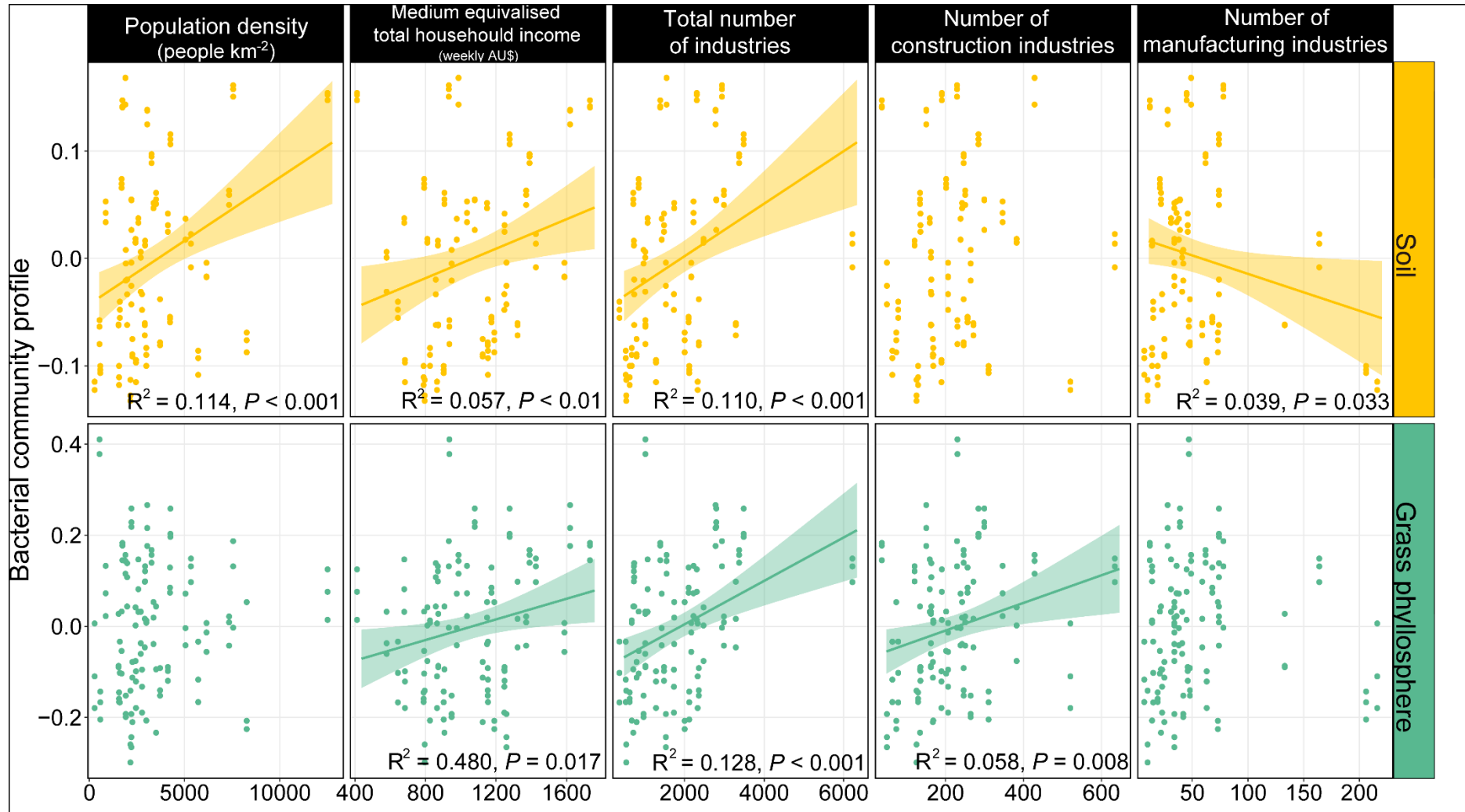


Fig. 4. Ordinary least square (OLS) regression model showing the relationships between anthropogenic parameters and microbial community compositions (the first axis values of PCoA analysis) in soil and grass phyllosphere in urban green spaces.

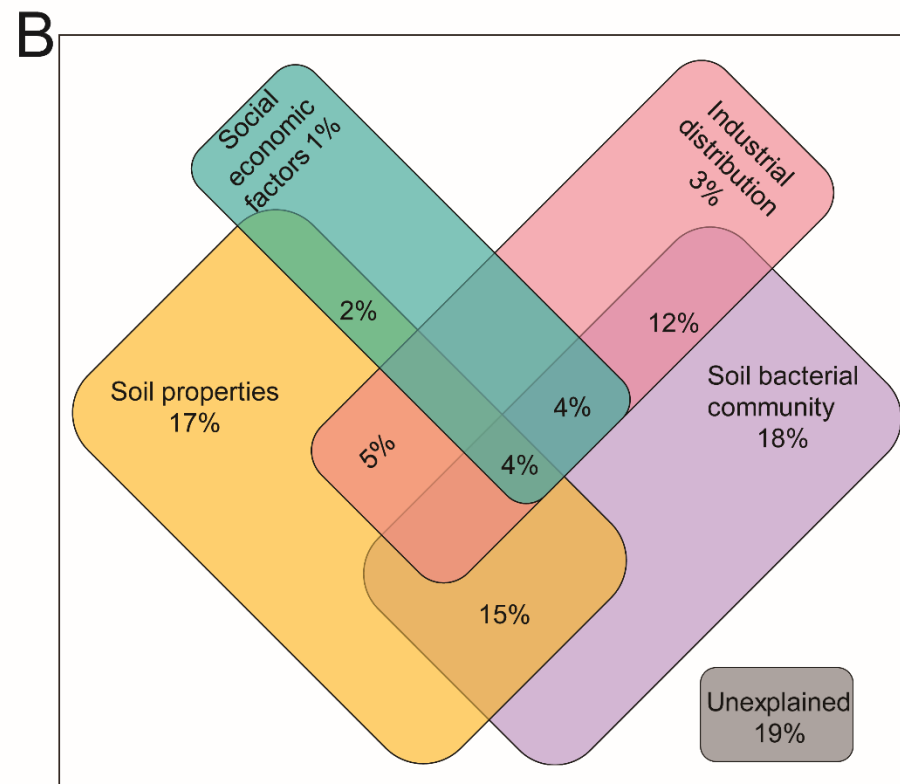
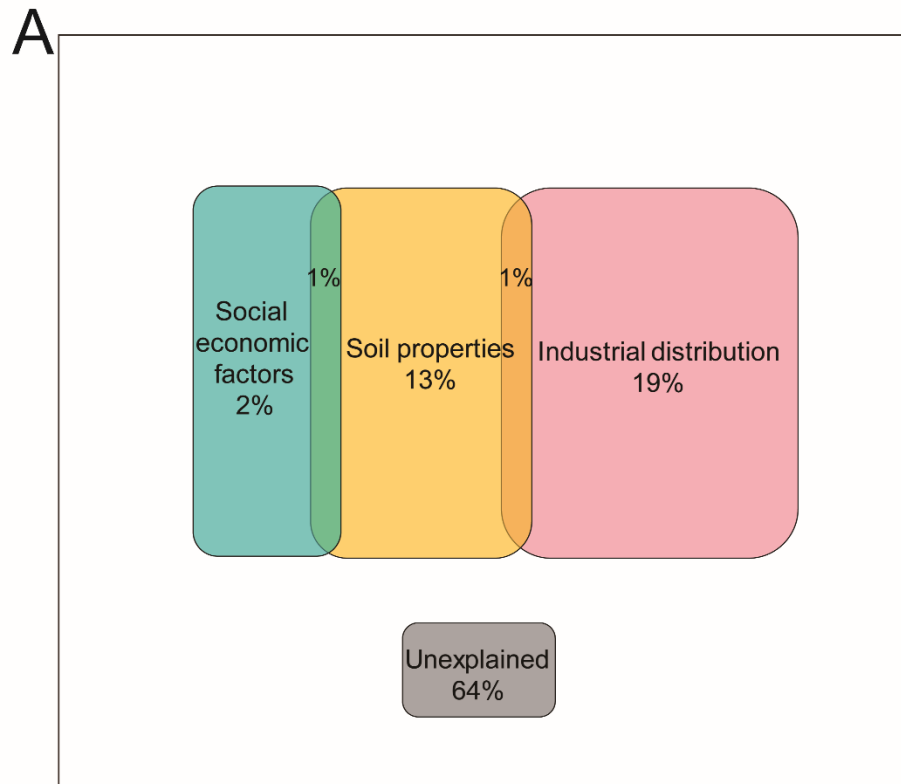


Fig. 5. Variation partitioning analysis (VPA) showing the effects of soil properties, soil bacterial communities, social economic factors and industrial factors on the alternation of soil (A) and grass phyllosphere microbial communities(B).

The authors declare no conflict of interest.

Author contributions: Zhen-Zhen Yan and Qing-Lin Chen designed research, Zhen-Zhen Yan performed the experiments and analyzed the data. Zhen-Zhen Yan wrote original draft. Qing-Lin Chen, Yu-Jing Zhang, Ji-Zheng He and Hang-Wei Hu contributed to manuscript revision. Hang-Wei Hu and Ji-Zheng He, Funding acquisition, Project administration.

Supporting data

Industrial development as a key factor explaining variances in soil and grass phyllosphere microbiomes in urban green spaces

Zhen-Zhen Yan ^a, Qing-Lin Chen ^{a, *}, Yu-Jing Zhang ^a, Ji-Zheng He ^a, Hang-Wei Hu ^{a, *}

^a Faculty of Veterinary and Agricultural Sciences, The University of Melbourne, VIC 3010,
Australia

Corresponding Authors at Faculty of Veterinary and Agricultural Sciences, The University of
Melbourne

*E-mail: qinglin.chen@unimelb.edu.au or hang-wei.hu@unimelb.edu.au

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Fig. S3. Heatmap of bacterial community compositions in soil (A) and grass phyllosphere (B) samples across the investigated urban green spaces and national parks at genera level.

Fig. S4. Boxplots showing the Shannon index (α diversity) in soil and grass phyllosphere samples in the 40 urban green spaces and three national parks. *** indicates $P < 0.001$ determined by paired t-test(A); and principal coordinate analysis (PCoA) based on the Bray-Curtis distance showing the distribution patterns of microbiome in soil and grass phyllosphere samples (β diversity) (B).

1 **Table S1** Detailed information of sampling sites.

Sample site ID	Green space Name	Statistic Area Level 2 (SA2) name	Suburb/Region name	Post code	Latitude	Longitude
U1	Parker Reserve	Coburg North	Coburg North	3058	37°43'20.30"S	144°58'2.56"E
U2	Parker Reserve	Coburg North	Coburg North	3058	37°43'22.53"S	144°58'3.08"E
U3	Parker Reserve	Coburg North	Coburg North	3058	37°43'17.40"S	144°58'1.07"E
U4	Charles Mutton Reserve	Fawkner	Fawkner	3060	37°42'49.99"S	144°58'12.46"E
U5	Charles Mutton Reserve	Fawkner	Fawkner	3060	37°42'50.12"S	144°58'9.37"E
U6	Charles Mutton Reserve	Fawkner	Fawkner	3060	37°42'49.86"S	144°58'16.41"E
U7	Greensborough Park	Greensborough	Greensborough	3088	37°42'0.76"S	145° 6'23.72"E
U8	Greensborough Park	Greensborough	Greensborough	3088	37°42'2.45"S	145° 6'22.59"E
U9	Greensborough Park	Greensborough	Greensborough	3088	37°41'59.92"S	145° 6'16.54"E
U10	Hibiscus Park	Bundoora-North	Bundoora	3083	37°41'2.01"S	145° 3'43.57"E
U11	Hibiscus Park	Bundoora-North	Bundoora	3083	37°41'3.11"S	145° 3'43.71"E
U12	Hibiscus Park	Bundoora-North	Bundoora	3083	37°41'1.97"S	145° 3'45.35"E
U13	Bricker Reserve	Moorabbin-Heatherton	Moorabbin	3189	37°56'27.67"S	145° 3'6.42"E

U14	Bricker Reserve	Moorabbin-Heatherton	Moorabbin	3189	37°56'29.98"S	145° 3'4.88"E
U15	Bricker Reserve	Moorabbin-Heatherton	Moorabbin	3189	37°56'31.77"S	145° 3'3.48"E
U16	Banksia Reserve Playground	Beaumaris	Beaumaris	3193	37°59'12.17"S	145° 2'31.58"E
U17	Banksia Reserve Playground	Beaumaris	Beaumaris	3193	37°59'9.90"S	145° 2'32.34"E
U18	Banksia Reserve Playground	Beaumaris	Beaumaris	3193	37°59'10.69"S	145° 2'29.98"E
U19	Dendy Park	Brighton East	Brighton East	3187	37°55'31.45"S	145° 1'23.98"E
U20	Dendy Park	Brighton East	Brighton East	3187	37°55'32.89"S	145° 1'20.83"E
U21	Dendy Park	Brighton East	Brighton East	3187	37°55'34.22"S	145° 1'25.40"E
U22	Carrum Pirate Ship Park	Carrum - Patterson Lakes	Carrum	3197	38° 4'35.75"S	145° 8'2.39"E
U23	Carrum Pirate Ship Park	Carrum - Patterson Lakes	Carrum	3197	38° 4'35.50"S	145° 7'59.92"E
U24	Carrum Pirate Ship Park	Carrum - Patterson Lakes	Carrum	3197	38° 4'38.22"S	145° 7'55.86"E
U25	Princess Park	Caulfied - South	Caulfied South	3162	37°53'37.50"S	145° 1'28.37"E
U26	Princess Park	Caulfied - South	Caulfied South	3162	37°53'39.11"S	145° 1'30.42"E
U27	Princess Park	Caulfied - South	Caulfied South	3162	37°53'36.81"S	145° 1'35.46"E

U28	Harleston Park	Elsternwick	Elsternwick	3185	37°52'52.10"S	145° 0'35.06"E
U29	Harleston Park	Elsternwick	Elsternwick	3185	37°52'53.00"S	145° 0'32.84"E
U30	Harleston Park	Elsternwick	Elsternwick	3185	37°52'53.50"S	145° 0'35.63"E
U31	Lord Reserve	Carnegie	Carnegie	3163	37°53'39.68"S	145° 2'56.80"E
U32	Lord Reserve	Carnegie	Carnegie	3163	37°53'38.23"S	37°53'38.23"S
U33	Lord Reserve	Carnegie	Carnegie	3163	37°53'41.83"S	145° 3'1.45"E
U34	Victoria Gardens	Prahran-Windsor	Prahran	3181	37°51'6.75"S	145° 0'3.68"E
U35	Victoria Gardens	Prahran-Windsor	Prahran	3181	37°51'7.04"S	145° 0'3.03"E
U36	Victoria Gardens	Prahran-Windsor	Prahran	3181	37° 51'7.03"E	145° 0'3.01"E
U37	Brookville Gardens	Toorak	Toorak	3142	37°50'43.81"S	37°50'43.81"S
U38	Brookville Gardens	Toorak	Toorak	3142	37°50'43.49"S	145° 0'32.10"E
U39	Brookville Gardens	Toorak	Toorak	3142	37°50'43.07"S	145° 0'35.02"E
U40	Citizens Park	Richmond (Vic.)	Richmond	3121	37°49'0.32"S	145° 0'2.53"E
U41	Citizens Park	Richmond (Vic.)	Richmond	3121	37°48'59.93"S	37°48'59.93"S
U42	Citizens Park	Richmond (Vic.)	Richmond	3121	37°49'1.69"S	145° 0'4.04"E
U43	Garden City Reserve	Port Melbourne	Port Melbourne	3207	37°50'11.08"S	144°55'47.35"E

U44	Garden City Reserve	Port Melbourne	Port Melbourne	3207	37°50'13.37"S	144°55'50.80"E
U45	Garden City Reserve	Port Melbourne	Port Melbourne	3207	37°50'10.95"S	37°50'10.95"S
U46	Templestowe Reserve	Templestowe	Templestowe	3106	37°45'14.52"S	145° 8'14.12"E
U47	Templestowe Reserve	Templestowe	Templestowe	3106	37°45'14.42"S	145° 8'15.63"E
U48	Templestowe Reserve	Templestowe	Templestowe	3106	37°45'16.54"S	145° 8'11.76"E
U49	Macleay Park	Balwyn North	Balwyn North	3104	37°48'4.88"S	145° 4'31.23"E
U50	Macleay Park	Balwyn North	Balwyn North	3104	37°48'3.62"S	145° 4'32.60"E
U51	Macleay Park	Balwyn North	Balwyn North	3104	37°48'5.91"S	145° 4'32.47"E
U52	Schramms Reserve	Doncaster	Doncaster	3108	37°46'58.83"S	145° 8'1.69"E
U53	Schramms Reserve	Doncaster	Doncaster	3108	37°47'1.10"S	145° 7'59.80"E
U54	Schramms Reserve	Doncaster	Doncaster	3108	37°47'0.73"S	145° 8'2.23"E
U55	Bennettswood Reserve	Burwood	Burwood	3125	37°50'54.44"S	145° 6'43.46"E
U56	Bennettswood Reserve	Burwood	Burwood	3125	37°50'51.51"S	145° 6'45.15"E
U57	Bennettswood Reserve	Burwood	Burwood	3125	37°50'57.05"S	145° 6'45.34"E
U58	Lynden Park	Camberwell	Camberwell	3124	37°50'36.34"S	145° 5'11.72"E
U59	Lynden Park	Camberwell	Camberwell	3124	37°50'38.81"S	145° 5'12.65"E

U60	Lynden Park	Camberwell	Camberwell	3124	37°50'38.04"S	145° 5'6.31"E
U61	Eley Park	Blackburn South	Blackburn South	3130	37°50'45.23"S	145° 8'34.33"E
U62	Eley Park	Blackburn South	Blackburn South	3130	37°50'44.83"S	145° 8'36.44"E
U63	Eley Park	Blackburn South	Blackburn South	3130	37°50'43.73"S	145° 8'33.14"E
U64	Central Gardens	Hawthorn	Hawthorn	3122	37°49'16.06"S	145° 2'29.33"E
U65	Central Gardens	Hawthorn	Hawthorn	3122	37°49'18.00"S	145° 2'27.44"E
U66	Central Gardens	Hawthorn	Hawthorn	3122	37°49'14.96"S	145° 2'31.59"E
U67	Malvern Public Gardens	Malvern - Glen Iris	Malvern	3144	37°51'25.03"S	145° 2'7.30"E
U68	Malvern Public Gardens	Malvern - Glen Iris	Malvern	3144	37°51'23.82"S	145° 2'8.77"E
U69	Malvern Public Gardens	Malvern - Glen Iris	Malvern	3144	37°51'20.57"S	145° 2'8.56"E
U70	Fitzroy Gardens	East Melbourne	East Melbourne	3002	37°48'45.94"S	144°58'51.36"E
U71	Fitzroy Gardens	East Melbourne	East Melbourne	3002	37°48'50.47"S	144°58'45.74"E
U72	Fitzroy Gardens	East Melbourne	East Melbourne	3002	37°48'42.46"S	144°58'57.72"E
U73	Queens Park	Moonee Ponds	Moonee Ponds	3039	37°45'43.70"S	37°45'43.70"S
U74	Queens Park	Moonee Ponds	Moonee Ponds	3039	37°45'43.95"S	144°55'27.56"E
U75	Queens Park	Moonee Ponds	Moonee Ponds	3039	37°45'42.11"S	144°55'24.19"E

U76	Batman Park	Northcote	Northcote	3070	37°49'18.34"S	144°57'26.08"E
U77	Batman Park	Northcote	Northcote	3070	37°49'18.80"S	144°57'23.70"E
U78	Batman Park	Northcote	Northcote	3070	37°49'18.94"S	144°57'21.71"E
U79	Flagstaff Gardens	North Melbourne	West Melbourne	3003	37°48'38.46"S	144°57'15.65"E
U80	Flagstaff Gardens	North Melbourne	West Melbourne	3003	37°48'35.44"S	144°57'18.43"E
U81	Flagstaff Gardens	North Melbourne	West Melbourne	3003	37°48'33.59"S	37°48'33.59"S
U82	Atherton Reserve	Fitzroy	Fitzroy	3065	37°48'11.98"S	144°58'45.28"E
U83	Atherton Reserve	Fitzroy	Fitzroy	3065	37°48'12.93"S	144°58'46.01"E
U84	Atherton Reserve	Fitzroy	Fitzroy	3065	37°48'12.81"S	144°58'44.11"E
U85	Carlton Gardens	Carlton	Carlton	3053	37°48'19.51"S	144°58'17.39"E
U86	Carlton Gardens	Carlton	Carlton	3053	37°48'20.30"S	144°58'14.83"E
U87	Carlton Gardens	Carlton	Carlton	3053	37°48'20.15"S	144°58'12.44"E
U88	H.P. Zwar Park	Preston-West	Preston	3072	37°44'27.80"S	144°59'46.74"E
U89	H.P. Zwar Park	Preston-West	Preston	3072	37°44'31.45"S	144°59'47.78"E
U90	H.P. Zwar Park	Preston-West	Preston	3072	37°44'31.10"S	144°59'44.17"E
U91	Brimbank Park	Keilor	Keilor East	3033	37°44'2.40"S	144°50'13.22"E

U92	Brimbank Park	Keilor	Keilor East	3033	37°44'1.94"S	144°49'58.45"E
U93	Brimbank Park	Keilor	Keilor East	3033	37°43'54.11"S	144°50'17.52"E
U94	A J Davis Reserve	Airport West	Airport West	3042	37°43'41.99"S	144°52'26.40"E
U95	A J Davis Reserve	Airport West	Airport West	3042	37°43'42.86"S	144°52'23.65"E
U96	A J Davis Reserve	Airport West	Airport West	3042	37°43'45.54"S	144°52'24.35"E
U97	Napier Park	Strathmore	Strathmore	3041	37°44'28.28"S	144°55'7.90"E
U98	Napier Park	Strathmore	Strathmore	3041	37°44'28.15"S	144°55'10.18"E
U99	Napier Park	Strathmore	Strathmore	3041	37°44'26.36"S	144°55'4.91"E
U100	Selwyn Park	Ardeer - Albion	Albion	3020	37°46'51.27"S	144°48'51.66"E
U101	Selwyn Park	Ardeer - Albion	Albion	3020	37°46'53.14"S	144°48'53.11"E
U102	Selwyn Park	Ardeer - Albion	Albion	3020	37°46'50.00"S	144°48'53.65"E
U103	Cairnlea Park	Cairnlea	Cairnlea	3023	37°45'35.68"S	144°47'44.24"E
U104	Cairnlea Park	Cairnlea	Cairnlea	3023	37°45'35.98"S	144°47'42.99"E
U105	Cairnlea Park	Cairnlea	Cairnlea	3023	37°45'36.77"S	144°47'44.79"E
U106	Braybrook Park	Braybrook	Braybrook	3019	37°47'13.78"S	144°51'17.84"E
U107	Braybrook Park	Braybrook	Braybrook	3019	37°47'12.17"S	144°51'19.15"E

U108	Braybrook Park	Braybrook	Braybrook	3019	37°47'15.04"S	144°51'20.62"E
U109	Pioneer Park	Sydenham	Sydenham	3037	37°41'13.06"S	37°41'13.06"S
U110	Pioneer Park	Sydenham	Sydenham	3037	37°41'15.28"S	144°45'31.88"E
U111	Pioneer Park	Sydenham	Sydenham	3037	37°41'13.56"S	144°45'42.77"E
U112	Mappin Reserve	Seddo - Kingsville	Seddon	3011	37°48'33.67"S	144°53'50.51"E
U113	Mappin Reserve	Seddo - Kingsville	Seddon	3011	37°48'33.04"S	144°53'51.48"E
U114	Mappin Reserve	Seddo - Kingsville	Seddon	3011	37°48'35.68"S	144°53'49.61"E
U115	Logan Reserve	Altona	Altona	3018	37°52'12.15"S	144°49'46.08"E
U116	Logan Reserve	Altona	Altona	3018	37°52'12.13"S	144°49'45.07"E
U117	Logan Reserve	Altona	Altona	3018	37°52'11.30"S	144°49'47.39"E
U118	Bruce Comben Reserve	Altona - Meadows	Altona Meadows	3028	37°52'19.19"S	144°46'1.12"E
U119	Bruce Comben Reserve	Altona - Meadows	Altona Meadows	3028	37°52'20.45"S	144°45'59.82"E
U120	Bruce Comben Reserve	Altona - Meadows	Altona Meadows	3028	37°52'17.88"S	144°46'3.48"E
N1	Yarra ranges national park	NA	Reefton	3799	37°38'11"S	145°54'23"E
N2	Yarra ranges national park	NA	Reefton	3799	37°37'53"S	145°54'28"E

N3	Yarra ranges national park	NA	Reefton	3799	37°37'52"S	145°54'31"E
N4	Lake Eildon national park	NA	Central highlands (Victoria)	3660	37°14'33"S	145°57'14"E
N5	Lake Eildon national park	NA	Central highlands (Victoria)	3660	37°14'2"S	145°57'7"E
N6	Lake Eildon national park	NA	Central highlands (Victoria)	3660	37°13'52"S	145°54'10"E
N7	Kinglake national park	NA	Kinglake	3763	37°25'28"S	145°15'48"E
N8	Kinglake national park	NA	Kinglake	3763	37°27'33"S	145°14'29"E
N9	Kinglake national park	NA	Kinglake	3763	37°27'37"S	145°14'19"E

3 **Table S2** Anthropogenic parameters of Statistical Area Level 2 (SA2) regions where the urban green spaces locate in.

SA2 name	Socio-economic parameters		Industrial distribution		
	Population density (people km ⁻²)	Median equivalised total household income (weekly AU\$)	Total number of industries	Number of construction industries	Number of manufacturing industries
Coburg North	1777	898	1130	174	137
Fawkner	2943	605	1126	174	45
Greensborough	2136	1013	1661	440	53
Bundoora-North	1801	815	735	141	23
Moorabbin-Heatherton	817	929	2231	322	210
Beaumaris	2447	1285	1644	61	38
Brighton East	3010	1273	1846	218	27
Carrum - Patterson Lakes	2155	974	1084	276	46
Caulfield - South	3955	1179	2472	258	52
Elsternwick	4366	1274	1597	147	50
Carnegie	5291	1003	1539	250	42
Prahran-Windsor	7582	1397	3102	262	78
Toorak	3281	1646	2892	162	32
Richmond (Vic.)	5576	1452	6331	646	168

Port Melbourne	6395	1614	2282	218	38
Templestowe	1100	1061	2339	358	40
Balwyn North	2451	1105	2910	311	43
Doncaster	2667	836	2591	394	38
Burwood	2814	705	1186	171	35
Camberwell	3156	1348	3402	283	63
Blackburn South	3168	896	840	132	18
Hawthorn	4498	1303	3599	296	78
Malvern - Glen Iris	3510	1416	3485	258	66
East Melbourne	1979	1759	1502	48	16
Moonee Ponds	3611	1175	1853	254	38
Northcote	4478	1200	2216	268	72
North Melbourne	7797	958	3054	241	82
Fitzroy	8505	1216	2116	85	77
Carlton	12753	437	2421	202	49
Preston-West	3745	933	826	146	26
Keilor	518	891	2443	532	220
Airport West	2226	884	848	175	78
Strathmore	2503	1150	908	179	29

Ardeer - Albion	1843	669	477	90	19
Cairnlea	2399	821	648	137	14
Braybrook	2690	709	1396	201	67
Sydenham	3232	851	786	180	18
Seddo - Kingsville	5959	1180	636	75	11
Altona	775	961	1129	242	51
Altona - Meadows	1936	818	961	213	25

5 **Table S3** List of analysed soil properties of the 120 soil samples from urban green spaces

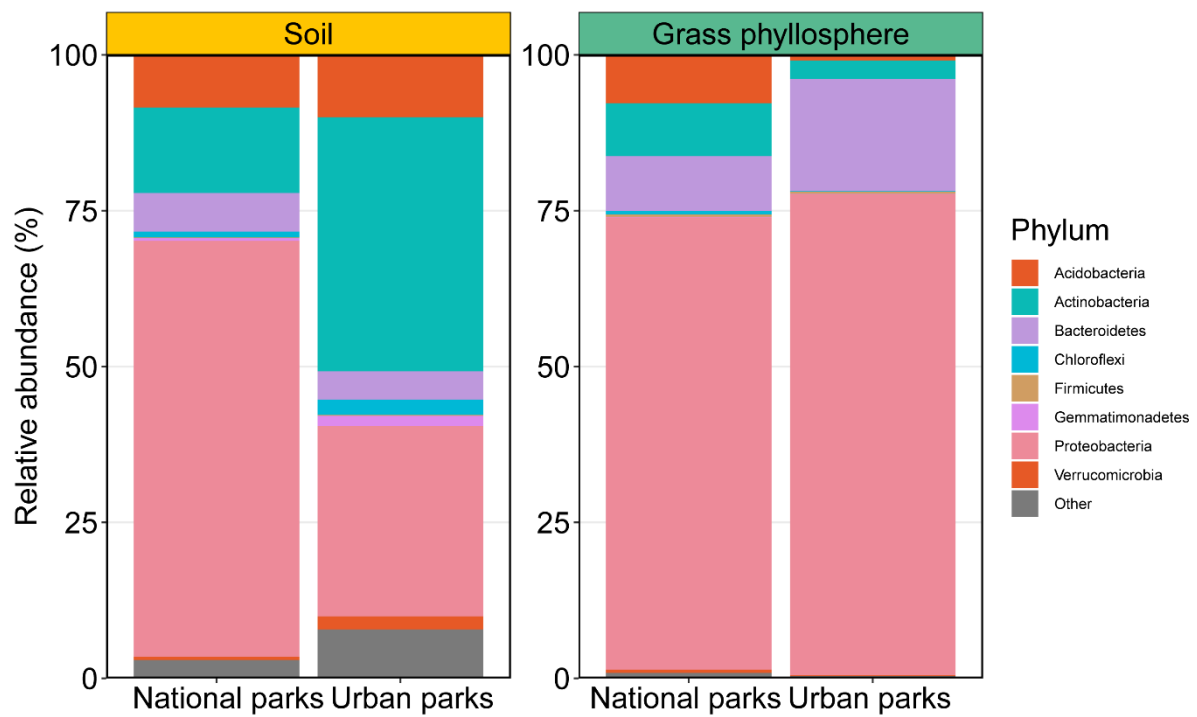
Sample ID	pH	EC (ds m ⁻¹)	CEC (coml kg ⁻¹)	Total carbon (%)	Total nitrogen (%)	Ammonium (mg L ⁻¹)	Nitrate (mg L ⁻¹)
SU1	6.12	0.27	19.95	5.41	0.47	1.86	12.20
SU2	6.12	0.34	21.39	5.75	0.55	12.50	18.80
SU3	6.23	0.29	20.52	5.66	0.52	10.20	15.80
SU4	6.18	0.11	11.16	3.10	0.29	3.14	4.90
SU5	6.21	0.14	15.20	3.85	0.36	2.55	6.30
SU6	6.23	0.15	17.04	4.75	0.44	2.64	7.42
SU7	6.36	0.11	11.35	2.68	0.26	1.57	3.31
SU8	6.44	0.12	11.76	2.72	0.27	1.89	3.23
SU9	6.32	0.11	10.84	2.54	0.25	1.23	3.04
SU10	5.56	0.16	16.67	5.63	0.52	0.54	9.18
SU11	5.77	0.13	17.17	4.45	0.39	0.20	7.81
SU12	5.72	0.14	15.12	4.71	0.42	0.20	7.80
SU13	5.90	0.18	13.65	5.57	0.43	0.83	8.73
SU14	5.91	0.19	14.62	6.06	0.47	1.00	8.56
SU15	5.91	0.20	14.77	6.16	0.48	1.03	8.78
SU16	5.71	0.09	8.95	4.97	0.42	1.64	4.43
SU17	5.70	0.10	9.29	5.38	0.46	1.67	4.38
SU18	5.65	0.10	9.08	5.07	0.45	1.67	4.47
SU19	5.86	0.11	9.36	4.60	0.40	0.20	6.18
SU20	5.93	0.10	9.90	4.36	0.37	0.27	6.27
SU21	5.89	0.11	9.99	4.18	0.37	0.71	5.62
SU22	6.31	0.12	9.46	2.40	0.21	0.56	6.78
SU23	6.27	0.12	11.11	2.90	0.25	0.56	6.90
SU24	6.26	0.15	10.98	3.12	0.27	0.68	7.13
SU25	6.24	0.20	10.76	4.15	0.34	1.24	10.70
SU26	6.17	0.20	11.21	3.92	0.31	1.11	11.60
SU27	6.30	0.19	9.52	3.26	0.25	1.09	10.50
SU28	6.26	0.08	11.06	3.56	0.24	0.74	4.53
SU29	6.43	0.10	11.93	3.33	0.25	0.62	6.04
SU30	6.49	0.10	11.54	3.28	0.25	0.55	5.63
SU31	6.15	0.12	10.56	3.82	0.3	4.10	3.37

SU32	6.16	0.12	11.25	4.175	0.34	3.78	3.26
SU33	6.12	0.12	10.71	3.66	0.30	3.63	3.55
SU34	5.84	0.13	8.93	3.25	0.27	2.55	7.16
SU35	5.72	0.17	9.57	3.59	0.30	3.09	9.48
SU36	5.84	0.20	10.19	3.298	0.28	5.50	11.4
SU37	6.15	0.12	13.82	4.38	0.38	0.56	8.19
SU38	6.15	0.12	12.76	4.14	0.34	0.39	7.56
SU39	6.12	0.13	14.06	4.35	0.38	0.32	8.55
SU40	6.81	0.13	17.41	4.38	0.34	0.27	6.54
SU41	6.82	0.14	17.19	4.22	0.34	0.20	6.91
SU42	6.84	0.14	17.37	4.26	0.35	0.20	6.73
SU43	6.89	0.11	13.89	5.11	0.36	0.20	6.03
SU44	6.91	0.11	14.57	4.62	0.32	0.24	6.42
SU45	6.88	0.11	6.33	4.69	0.34	0.20	5.94
SU46	7.38	0.13	18.16	3.72	0.281	0.20	6.69
SU47	7.35	0.13	20.02	4.40	0.31	0.20	7.17
SU48	7.43	0.13	21.07	4.01	0.29	0.20	6.28
SU49	5.63	0.06	6.88	3.24	0.26	1.64	3.59
SU50	5.75	0.06	8.07	3.26	0.27	2.01	3.18
SU51	5.79	0.07	8.11	3.49	0.29	2.18	3.44
SU52	6.17	0.17	15.26	4.37	0.39	1.45	6.84
SU53	6.14	0.16	15.08	4.35	0.39	1.39	7.24
SU54	6.14	0.16	14.58	4.04	0.36	1.08	7.00
SU55	5.98	0.12	6.27	1.83	0.17	1.63	5.44
SU56	6.04	0.13	15.47	1.80	0.17	1.91	6.14
SU57	6.05	0.12	5.89	1.70	0.16	1.43	5.58
SU58	5.70	0.10	12.23	4.56	0.40	0.75	5.74
SU59	5.75	0.09	11.33	4.26	0.36	0.20	5.29
SU60	5.78	0.09	11.23	4.31	0.37	0.29	5.40
SU61	5.80	0.11	13.48	4.89	0.42	1.51	6.48
SU62	5.82	0.11	13.58	4.91	0.43	2.04	6.66
SU63	5.84	0.10	13.18	4.92	0.43	1.88	6.03
SU64	6.30	0.12	17.83	5.00	0.38	0.49	5.77
SU65	6.32	0.12	18.44	4.93	0.37	1.21	6.34
SU66	6.27	0.12	17.46	4.94	0.37	0.84	5.82

SU67	6.69	0.11	17.67	4.93	0.38	0.75	6.94
SU68	6.89	0.12	17.98	4.43	0.35	0.52	6.83
SU69	6.80	0.12	16.64	4.52	0.36	0.83	6.98
SU70	6.51	0.17	23.59	6.29	0.49	0.20	10.00
SU71	6.50	0.17	23.35	5.82	0.46	0.24	10.20
SU72	6.53	0.158	24.45	5.82	0.46	0.40	9.45
SU73	5.74	0.18	26.42	9.48	0.67	2.08	7.38
SU74	5.89	0.15	26.10	8.64	0.59	2.50	6.99
SU75	5.84	0.16	26.43	9.52	0.66	2.25	7.41
SU76	7.44	0.27	26.85	4.60	0.38	0.23	5.15
SU77	7.38	0.28	25.38	4.72	0.39	0.20	5.37
SU78	7.40	0.26	28.84	4.63	0.38	0.21	6.16
SU79	7.29	0.156	34.61	8.10	0.57	0.20	5.03
SU80	7.11	0.15	33.90	7.64	0.53	0.20	5.48
SU81	7.08	0.17	33.98	7.43	0.51	0.20	6.06
SU82	5.94	0.13	19.83	5.89	0.48	2.34	5.40
SU83	5.90	0.13	19.87	5.57	0.47	0.49	5.50
SU84	5.90	0.14	19.68	5.77	0.49	0.53	6.95
SU85	6.37	0.18	33.87	9.62	0.652	2.26	8.17
U86	6.31	0.17	32.91	9.712	0.682	2.23	8.13
U87	6.33	0.18	30.56	9.14	0.65	2.28	8.42
U88	6.97	0.16	21.17	4.59	0.40	0.20	6.11
U89	7.05	0.17	19.41	5.11	0.44	0.20	6.47
U90	7.09	0.18	21.40	5.20	0.45	0.20	7.06
U91	7.00	0.12	27.57	6.60	0.42	0.20	3.87
U92	6.93	0.12	26.98	5.75	0.39	0.20	4.07
U93	6.97	0.12	27.55	6.29	0.40	0.20	4.06
U94	7.65	0.26	42.73	4.85	0.43	0.20	8.40
U95	7.68	0.24	43.19	5.30	0.46	0.20	7.88
U96	7.71	0.24	42.17	5.16	0.44	0.48	9.41
U97	6.59	0.19	27.91	7.83	0.62	0.78	6.23
U98	6.43	0.17	24.20	7.63	0.59	0.79	6.31
U99	6.57	0.19	26.59	7.83	0.61	0.94	6.37
U100	6.75	0.19	18.60	4.59	0.38	2.29	2.32
U101	6.55	0.18	17.24	3.20	0.28	1.46	2.15

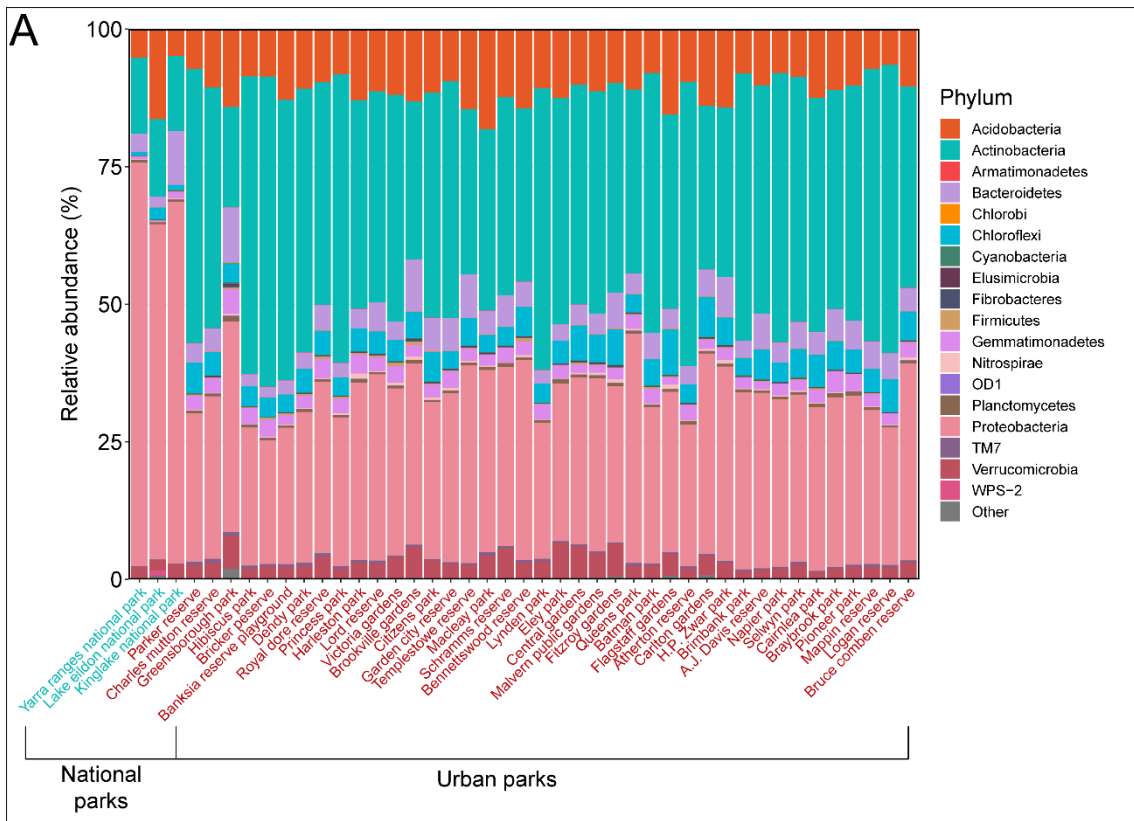
U102	6.65	0.19	18.23	3.90	0.34	2.04	2.18
U103	7.56	0.14	14.21	2.14	0.16	0.35	1.30
U104	7.66	0.15	14.70	2.31	0.18	0.42	1.49
U105	7.80	0.17	17.91	2.49	0.19	0.44	1.35
U106	7.83	0.24	33.61	3.80	0.31	0.24	3.40
U107	7.98	0.26	34.23	2.90	0.25	0.33	3.03
U108	7.71	0.22	33.24	4.15	0.31	0.38	3.06
U109	6.81	0.13	28.26	4.69	0.37	0.25	4.93
U110	6.77	0.13	27.49	4.60	0.36	0.24	5.23
U111	6.73	0.13	28.71	4.32	0.38	0.30	4.94
U112	6.18	0.27	17.47	4.24	0.364	16.50	6.06
U113	6.20	0.23	17.01	3.98	0.35	12.80	6.03
U114	6.26	0.23	16.63	3.90	0.36	12.90	6.33
U115	7.09	0.89	51.23	9.20	0.86	0.54	9.53
U116	7.10	0.73	50.06	9.65	0.91	0.54	7.93
U117	7.22	0.91	52.15	9.06	0.84	0.29	10.70
U118	6.65	0.35	22.49	5.24	0.41	0.35	9.55
U119	6.41	0.30	23.37	6.69	0.56	0.47	10.30
U120	6.45	0.29	21.50	4.98	0.40112	0.77	8.44

6

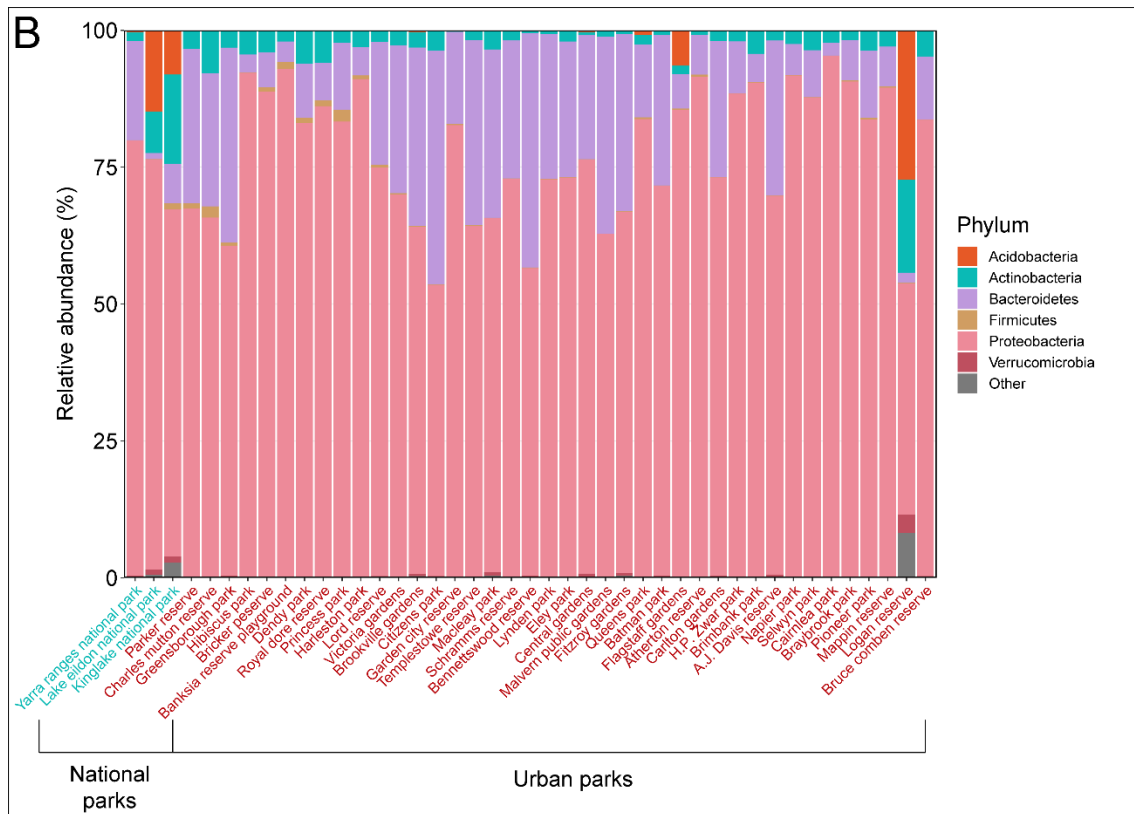


7

8 **Fig. S1.** Bacterial community compositions in soil and grass phyllosphere samples across
 9 sampling sites at phylum level.

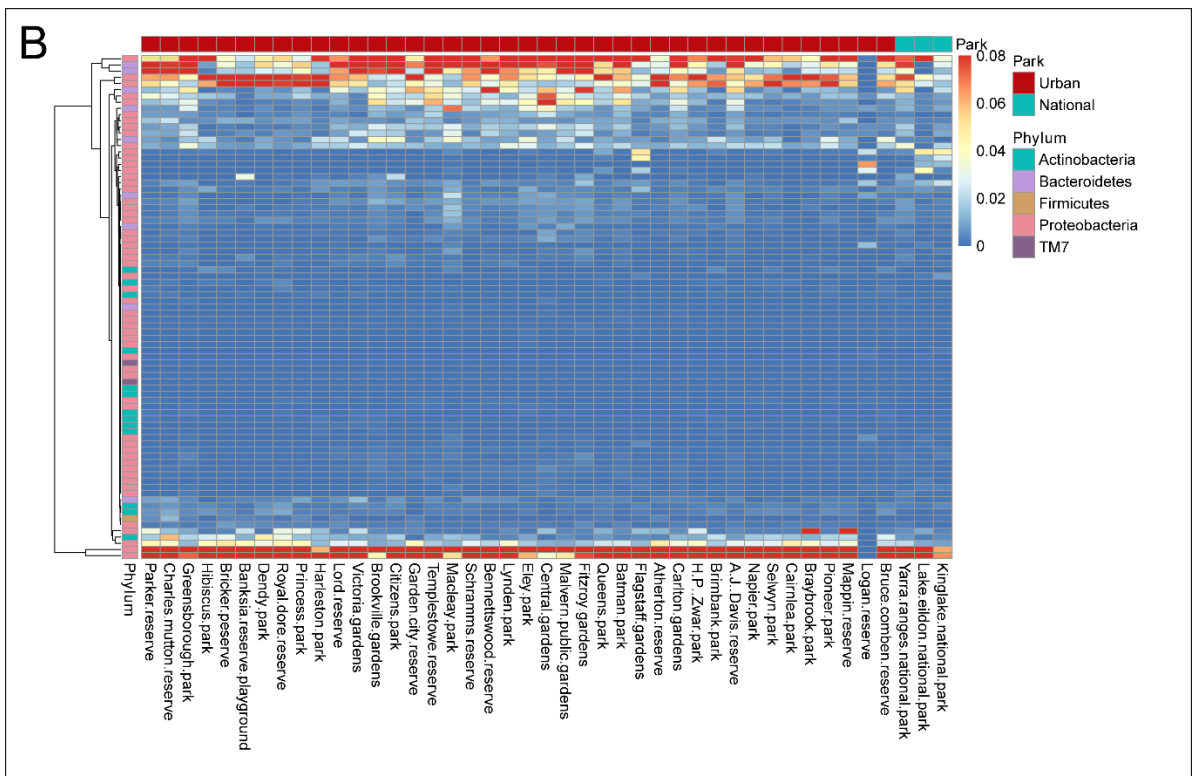
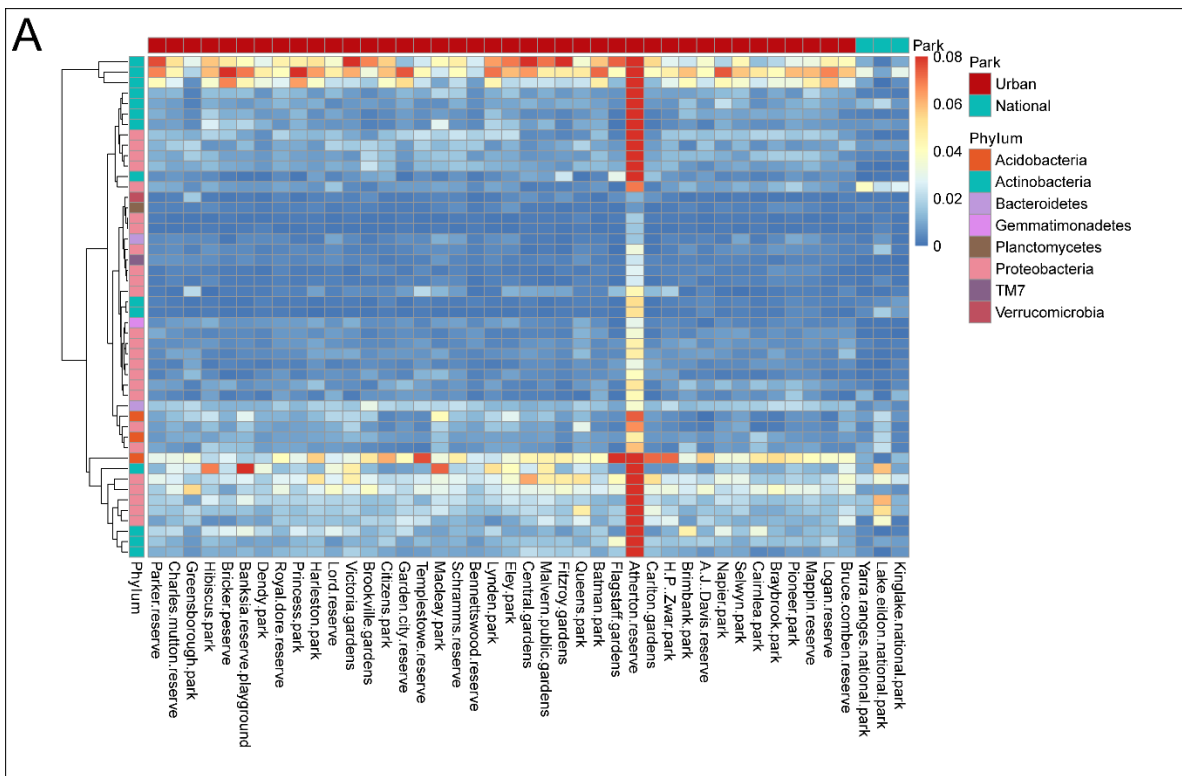


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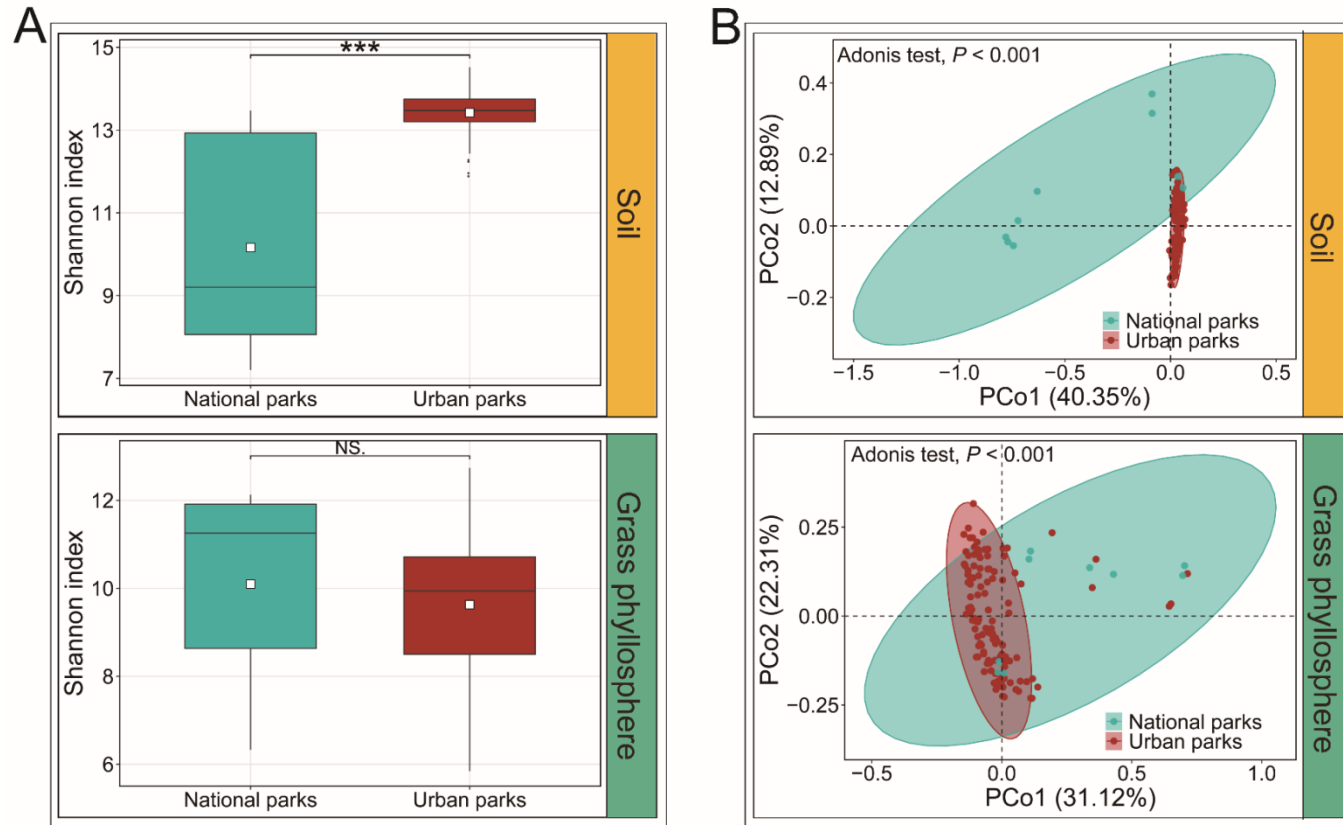


11

12 **Fig. S2.** Distribution bar-plot of bacterial community compositions in soil (A) and grass
 13 phyllosphere (B) samples across different urban green spaces and national parks at the
 14 phylum level.



18 **Fig. S3.** Heatmap of bacterial community compositions in soil (A) and grass phyllosphere (B)
 19 samples across the investigated urban green spaces and national parks at genera level.



21

22 **Fig. S4.** Boxplots showing the Shannon index (α diversity) in soil and grass phyllosphere samples in the 40 urban green spaces and three
 23 national parks. *** indicates $P < 0.001$ determined by Mann-Whitney-Wilcoxon test. The white squares indicate the mean values (A). Principal
 24 coordinate analysis (PCoA) based on the Bray-Curtis distance showing the distribution patterns of microbiome in soil and grass phyllosphere
 25 samples (β diversity) (B).